# **Proof-Oriented Programming in F\***

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F\* is a dependently typed programming language and proof assistant. This book describes how to use F\* for *proof-oriented programming*, a paradigm in which one co-designs programs and proofs to provide mathematical guarantees about various aspects of a program's behavior, including properties like functional correctness (precisely characterizing the input/output behavior of a program), security properties (e.g., ensuring that a program never leaks certain secrets), and bounds on resource usage.

Although a functional programming language at its core, F\* promotes programming in a variety of paradigms, including programming with pure, total functions, low-level programming in imperative languages like C and assembly, concurrent programming with shared memory and message-passing, and distributed programming. Built on top of F\*'s expressive, dependently typed core logic, no matter which paradigm you choose, proof-oriented programming in F\* enables constructing programs with proofs that they behave as intended.

A note on authorship: Many people have contributed to the development of  $F^*$  over the past decade. Many parts of this book too are based on research papers, libraries, code samples, and language features co-authored with several other people. However, the presentation here, including especially any errors or oversights, are due to the authors. That said, contributions are most welcome and we hope this book will soon include chapters authored by others.

# Structure of this book

#### This book is a work in progress

The first four parts of this book explain the main features of the language using a variety of examples. You should read them sequentially, following along with the associated code samples and exercises. These first four parts are arranged in increasing order of complexity—you can stop after any of them and have a working knowledge of useful fragments of  $F^*$ .

The remaining parts of the book are more loosely connected and either provide a reference guide to the compiler and libraries, or develop case studies that the reader can choose depending on their interest. Of course, some of those case studies come with prerequisites, e.g., you must have read about effects before tackling the case study on parsers and formatters.

Part 1: Basic Functional Programming and Proofs

The first part of this book provides a basic introduction to programming with pure total functions, refinement types, and SMT-based proofs, and how to compile and execute your first  $F^*$  program. This part of the book revises a previous online tutorial on  $F^*$  and is targeted at an audience familiar with programming, though with no background in formal proofs. Even if you are familiar with program proofs and dependent types, it will be useful to quickly go through this part, since some elements are quite specific to  $F^*$ .

• Part 2: Inductive Types for Data, Proofs, and Computations

We turn next to inductive type definitions, the main mechanism by which a user can define new data types. F\*'s indexed inductive types allow one to capture useful properties of data structures, and dependently types functions over these indexed types can be proven to respect several kinds of invariants. Beyond their use for data structures, inductive data types are used at the core of F\*'s logic to model fundamental notions like equality and termination proofs, and can also be used to model and embed other programming paradigms within F\*.

• Part 3: Modularity with Interfaces and Typeclasses

We discuss two main abstraction techniques, useful in structuring larger developments: interfaces and typeclasses. Interfaces are a simple information hiding mechanism built in to F\*'s module system. Typeclasses are suitable for more advanced developments, providing more flexible abstraction patterns coupled with custom type inference.

• Part 4: Computational Effects

We introduce F\*'s effect system, starting with its primitive effects for total, ghost, and divergent computations. We also provide a brief primer on Floyd-Hoare logic and weakest precondition calculi, connecting them to Dijkstra monads, a core concept in the design of F\*'s effect system.

• Part 5: Tactics and Metaprogramming

We introduce Meta-F\*, the metaprogramming system included in F\*. Meta-F\* can be used to automate the construction of proofs as well as programmatically construct fragments of F\* programs. There's a lot to cover here—the material so far presents the basics of how to get started with using Meta-F\* to target specific assertions in your program and to have their proofs be solved using a mixture of tactics and SMT solving.

• Under the hood: F\* & SMT

In this part of the book, we cover how  $F^*$  uses the Z3 SMT solver. We present a brief overview of  $F^*$ 's SMT encoding paying attention in particular to  $F^*$  use of fuel to throttle SMT solver's unfolding of recursive functions and inductive type definitions. We also cover a bit of how quantifier instantiation works, how to profile Z3's quantifier instantiation, and some strategies for how to control proofs that are too slow because of excessive quantifier instantiation.

· Planned content

The rest of the book is still in the works, but the planned content is the following:

- Part 4: User-defined Effects
  - State
  - Exceptions
  - Concurrency
  - Algebraic Effects
- Part 5: Tactics and Metaprogramming
  - Reflecting on syntax
  - Holes and proof states
  - Builtin tactics
  - Derived tactics
  - Interactive proofs
  - Custom decision procedures
  - Proofs by reflection
  - Synthesizing programs
  - Tactics for program extraction
- Part 6: F\* Libraries
- Part 7: A User's Guide to Structuring and Maintaining F\* Developments
  - The Build System
    - Dependence Analysis Checked files Sample project
  - Using the F\* editor
  - Proofs by normalization
    - \* Normalization steps
    - \* Call-by-name vs. call-by-value
    - \* Native execution and plugins
  - Proof Engineering
    - \* Building, maintaining and debugging stable proofs
  - Extraction

- \* OCaml
- \* F#
- \* KaRaMeL
- \* Partial evaluation
- Command line options
- A guide to various F\* error messages
- Syntax guide
- FAQ
- Part 8: Steel: A Concurrent Separation Logic Embedded in  $F^*$
- Part 9: Application to High-assurance Cryptography
- Part 10: Application to Parsers and Formatters

# Part I

# A CAPSULE SUMMARY OF F\*

F\* is a dependently type programming language that aims to play several roles:

- A general purpose programming language, which encourages higher-order functional programming with effects, in the tradition of the ML family of languages.
- A compiler, which translates F\* programs to OCaml or F#, and even C or Wasm, for execution.
- A proof assistant, in which to state and prove properties of programs.
- A program verification engine, leveraging SMT solvers to partially automate proofs of programs.
- A metaprogramming system, supporting the programmatic construction of F\* programs and proof automation procedures.

To achieve these goals, the design of F\* revolves around a few key elements, described below. Not all of this may make sense to you—that's okay, you'll learn about it as we go.

- A core language of total functions with full dependent types, including an extensional form of type conversion, indexed inductive types, and pattern matching, recursive functions with semantic termination checking, dependent refinement types and subtyping, and polymorphism over a predicative hierarchy of universes.
- A system of user-defined indexed effects, for modeling, encapsulating, and statically reasoning about various
  forms of computational effects, including a primitive notion of general recursion and divergence, as well as an
  open system of user-defined effects, with examples including state, exceptions, concurrency, algebraic effects,
  and several others.
- A built-in encoding of a classical fragment of F\*'s logic into the first order logic of an SMT solver, allowing many proofs to be automatically discharged.
- A reflection within F\* of the syntax and proof state of F\*, enabling Meta-F\* programs to manipulate F\* syntax and proof goals and for users to build proofs interactively with tactics.

# 1.1 DSLs Embedded in F\*

In practice, rather than a single language, the  $F^*$  ecosystem is also a collection of domain-specific languages (DSLs). A common use of  $F^*$  is to embed within it programming languages at different levels of abstraction or for specific programming tasks, and for the embedded language to be engineered with domain-specific reasoning, proof automation, and compilation backends. Some examples include:

Low\*, an shallowly embedded DSL for sequential programming against a C-like memory model including explicit memory management on the stack and heap; a Hoare logic for partial correctness based on implicit dynamic frames; and a custom backend (Karamel) to compile Low\* programs to C for further compilation by off-the-shelf C compilers.

- EverParse, a shallow embedding of a DSL (layered on top of the Low\* DSL) of parser and serializer combinators, for low-level binary formats.
- Vale, a deeply embedded DSL for structured programming in a user-defined assembly language, with a Hoare logic for total correctness, and a printer to emit verified programs in a assembly syntax compatible with various standard assemblers.
- Steel, a shallow embedding of concurrency as an effect in F\*, with an extensible concurrent separation logic for partial correctness as a core program logic, and proof automation built using a combination of Meta-F\* tactics, higher-order unification, and SMT.
- Pulse, a successor of Steel, a DSL with custom syntax and typechecking algorithm, providing proofs in a small but highly expressive core logic for mutable state and concurrency called PulseCore, formalized entirely in terms of pure and ghost functions in F\*.

To get a taste of  $F^*$ , let's dive right in with some examples. At this stage, we don't expect you to understand these examples in detail, though it should give you a flavor of what is possible with  $F^*$ .

# 1.2 F\* is a dependently typed language

Dependently typed programming enables one to more precisely capture properties and invariants of a program using types. Here's a classic example: the type vec a n represents an n-dimensional vector of a-typed elements; or, more simply, a list of n values each of type a. Like other dependently typed languages, F\* supports inductively defined definitions of types.

```
type vec (a:Type) : nat -> Type =
   | Nil : vec a 0
   | Cons : #n:nat -> hd:a -> tl:vec a n -> vec a (n + 1)
```

Operations on a vectors can be given types that describe their behavior in terms of vector lengths.

For example, here's a recursive function append to concatenate two vectors. Its type shows that the resulting vector has a length that is the sum of the lengths of the input vectors.

```
let rec append #a #n #m (v1:vec a n) (v2:vec a m)
   : vec a (n + m)
   = match v1 with
   | Nil -> v2
   | Cons hd tl -> Cons hd (append tl v2)
```

Of course, once a function like append is defined, it can be used to define other operations and its type helps in proving further properties. For example, it's easy to show that reversing a vector does not change its length.

Finally, to get an element from a vector, one can program a selector whose type also includes a *refinement type* to specify that the index i is less than the length of the vector.

(continued from previous page)

```
if i = 0 then hd else get (i - 1) tl
```

While examples like this can be programmed in other dependently typed languages, they can often be tedious, due to various technical restrictions. F\* provides a core logic with a more flexible notion of equality to make programming and proving easier. For now, a takeaway is that dependently typed programming patterns that are quite technical in other languages are often fairly natural in F\*. You'll learn more about this in *a later chapter*.

# 1.3 F\* supports user-defined effectful programming

While functional programming is at the heart of the language, F\* is about more than just pure functions. In fact, F\* is a Turing complete language. That this is even worth mentioning may come as a surprise to readers with a background in general-purpose programming languages like C# or Scala, but not all dependently typed languages are Turing complete, since nontermination can break soundness. However, F\* supports general recursive functions and non-termination in a safe manner, without compromising soundness.

Beyond nontermination, F\* supports a system of user-defined computational effects which can be used to model a variety of programming idioms, including things like mutable state, exceptions, concurrency, IO, etc.

Here below is some code in an F\* dialect called Low\* which provides a sequential, imperative C-like programming model with mutable memory. The function malloc\_copy\_free allocates an array dest, copies the contents of an array of bytes src into a dest, deallocates src and returns dest.

It'll take us until much later to explain this code in full detail, but here are two main points to take away:

- The type signature of the procedure claims that under specific constraints on a caller, malloc\_copy\_free is *safe* to execute (e.g., it does not read outside the bounds of allocated memory) and that it is *correct* (i.e., that it successfully copies src to dest without modifying any other memory)
- Given the implementation of a procedure, F\* actually builds a mathematical proof that it is safe and correct with respect to its signature.

While other program verifiers offer features similar to what we've used here, a notable thing about F\* is that the semantics of programs with side effects (like reading and writing memory) is entirely encoded within F\*'s logic using a system of user-defined effects.

Whereas  $malloc\_copy\_free$  is programmed in Low\* and specified using a particular kind of Floyd-Hoare logic, there's nothing really special about it in F\*.

Here, for example, is a concurrent program in another user-defined F\* dialect called Steel. It increments two heapallocated references in parallel and is specified for safety and correctness in concurrent separation logic, a different kind of Floyd-Hoare logic than the one we used for malloc\_copy\_free.

As an F\* user, you can choose a programming model and a suite of program proof abstractions to match your needs. You'll learn more about this in the section on *user-defined effects*.

# 1.4 F\* proofs use SMT solving, symbolic computation and tactics

Stating a theorem or lemma in  $F^*$  amounts to declaring a type signature and doing a proof corresponds to providing an implementation of that signature. Proving theorems can take a fair bit of work by a human and  $F^*$  seeks to reduce that burden, using a variety of techniques.

#### **SMT Solving**

Proving even a simple program often involves proving dozens or hundreds of small facts, e.g., proving that bounded arithmetic doesn't overflow, or that ill-defined operations like divisions by zero never occur. All these little proofs can quickly overwhelm a user.

The main workhorse for proofs in F\* is an automated theorem prover, known as a *Satisfiability Modulo Theories*, or SMT, solver. The F\* toolchain integrates the Z3 SMT Solver.

By default, the F\* typechecker collects all the facts that must be proven in a program and encodes them to the SMT solver, an engine that is capable of solving problems in various combinations of mathematical logics—F\* encodes problems to Z3 in a combination of first-order logic, with uninterpreted functions and integer arithmetic.

Z3 is remarkably effective at solving the kinds of problems that  $F^*$  generates for it. The result is that some  $F^*$  programs enjoy a high level of automation, e.g., in memcpy, we specified a pre- and postcondition and a loop invariant, and the system took care of all the remaining proofs.

You'll learn more about how to use leverage Z3 to prove theorems in  $F^*$  in *this chapter*.

That said, Z3 cannot solve all problems that F\* feeds to it. As such, F\* offers several other mechanisms with varying levels of user control.

# **Symbolic computation**

SMT solvers are great at proofs that involve equational rewriting, but many proofs can be done simply by computation. In fact, proofs by computation are a distinctive feature of many dependently typed languages and  $F^*$  is no exception.

As a very simple example, consider proving that pow2 12 == 4096, where pow2 is the recursive function shown below.

An easy way to convince F\* of this fact is to ask it (using normalize\_term\_spec) to simply compute the result of pow2 12 on an interpreter that's part of the F\* toolchain, which it can do instantly, rather than relying on an SMT solvers expensive equational machinery to encode the reduction of a recursive function.

This reduction machinery (called the *normalizer*) is capable not only of fully computing terms like pow2 12 to a result, but it can also partially reduce symbolic F\* terms, as shown in the proof below.

The proof invokes the F\* normalizer from a tactic called T.trefl, another F\* feature that we'll review quickly, next.

#### **Tactics and Metaprogramming**

Finally, for complete control over a proof, F\* includes a powerful tactic and metaprogramming system.

Here's a simple example of an interactive proof of a simple fact about propositions using F\* tactics.

This style of proof is similar to what you might find in systems like Coq or Lean. An  $F^*$  tactic is just an  $F^*$  program that can manipulate  $F^*$  proof states. In this case, to prove the theorem  $a ==> b ==> (b /\ a)$ , we apply commands to transform the proof state by applying the rules of propositional logic, building a proof of the theorem.

Tactics are an instance of a more general metaprogramming system in  $F^*$ , which allows an  $F^*$  program to generate other  $F^*$  programs.

# 1.5 F\* programs compile to OCaml and F#, C and Wasm

Of course, you'll want a way to actually execute the programs you write. For this, F\* provides several ways to compile a program to other languages for execution, including support to compile programs to OCaml, F#, C and Wasm.

As such, a common way to use  $F^*$  is to develop critical components of larger software systems in it, use its proof-oriented facilities to obtain assurances about those components, and then to integrate those formally proven components into a larger system by compiling the  $F^*$  program to C, OCaml, or  $F^*$  and linking the pieces together.

In this case, using a tool called KaRaMeL, a compiler used with F\*, we can produce the following C code for memcpy.

```
uint8_t *MemCpy_malloc_copy_free(uint32_t len, uint8_t *src)
{
   KRML_CHECK_SIZE(sizeof (uint8_t), len);
   uint8_t *dest = KRML_HOST_CALLOC(len, sizeof (uint8_t));
   MemCpy_memcpy(len, (uint32_t)0U, src, dest);
   KRML_HOST_FREE(src);
   return dest;
}
```

Notice that the code we get contains no additional runtime checks: the detailed requires and ensures clauses are all gone and what's left is just a plain C code. Later we'll see how to actually write loops, so that you're not left with recursive functions in C. The point is that all the proof and specification effort is done before the program is compiled, imposing no runtime overhead at all.

# 1.6 To F\*, or not to F\*?

We've quickly seen a bit of what  $F^*$  has to offer—that may have been bit overwhelming, if you're new to program proofs. So, you may be wondering now about whether it's worth learning  $F^*$  or not. Here are some things to consider.

If you like programming and want to get better at it, no matter what your level is, learning about program proofs will help. Proving a program, or even just writing down a specification for it, forces you to think about aspects of your program that you may never have considered before. There are many excellent resources available to learn about program proofs, using a variety of other tools, including some of the following:

- Software Foundations: A comprehensive overview of programming language semantics and formal proofs in the Coq proof assistant.
- A Proof Assistant for Higher-Order Logic: A tutorial on the Isabelle/HOL proof assistant.
- Certified Programming with Dependent Types: Provides an introduction to proof engineering in Coq.
- Type-driven Development: Introduces using dependent types to developing programs correctly in Idris.
- Theorem Proving in Lean: This is the standard reference for learning about the Lean theorem prover, though there are several other resources too.
- Dafny resources: A different flavor than all of the above, Dafny is an SMT powered program verifier for imperative programs.
- Liquid Haskell: This tutorial showcases proving programs with refinement types.

All of these are excellent resources and each tool has unique offerings. This book about F\* offers a few unique things too. We discuss a few pros and cons, next.

#### **Dependent Types and Extensionality**

F\*'s dependent types are similar in expressiveness to Coq, Lean, Agda, or Idris, i.e., the expressive power allows formalizing nearly all kinds of mathematics. What sets F\* apart from these other languages (and more like Nuprl) is its extensional notion of type equality, making many programming patterns significantly smoother in F\* (cf. the *vector* example). However, this design also makes typechecking in F\* undecidable. The practical consequences of this are that F\* typechecker can time-out and refuse to accept your program. Other dependently typed languages have decidable typechecking, though they can, in principle, take arbitrarily long to decide whether or not your program is type correct.

# **A Variety of Proof Automation Tools**

F\*'s use of an SMT solver for proof automation is unique among languages with dependent types, though in return, one needs to also trust the combination of F\* and Z3 to believe in the validity of an F\* proof. Isabelle/HOL provides similar SMT-assisted automation (in its Sledgehammer tool), for the weaker logic provided by HOL, though Sledgehammer's design ensures that the SMT solver need not be trusted. F\*'s use of SMT is also similar to what program verifiers like Dafny and Liquid Haskell offer. However, unlike their SMT-only proof strategies, F\*, like Coq and Lean, also provides symbolic reduction, tactics, and metaprogramming. That said, F\*'s tactic and metaprogramming engines are less mature than other systems where tactics are the primary way of conducting proofs.

# A Focus on Programming

Other dependently typed languages shine in their usage in formalizing mathematics—Lean's mathlib and Coq's Mathematical Components are two great examples. In comparison, to date, relatively little pure mathematics has been formalized in F\*. Rather, F\*, with its focus on effectful programming and compilation to mainstream languages like C,

has been used to it produce industrial-grade high-assurance software, deployed in settings like the Windows and Linux kernels, among many others.

#### **Maturity and Community**

Isabelle/HOL and Coq are mature tools that have been developed and maintained for many decades, have strong user communities in academia, and many sources of documentation. Lean's community is growing fast and also has excellent tools and documentation. F\* is less mature, its design has been the subject of several research papers, making it somewhat more experimental. The F\* community is also smaller, its documentation is more sparse, and F\* users are usually in relatively close proximity to the F\* development team. However, F\* developments also have a good and growing track record of industrial adoption.

# 1.7 A Bit of F\* History

F\* is an open source project at GitHub by researchers at a number of institutions, including Microsoft Research, MSR-Inria, Rosario, and Carnegie-Mellon.

**The name** The F in F\* is a homage to System F (https://en.wikipedia.org/wiki/System\_F) which was the base calculus of an early version of F\*. We've moved beyond it for some years now, however. The F part of the name is also derived from several prior languages that many authors of F\* worked on, including Fable, F7, F9, F5, FX, and even F#.

The "\*" was meant as a kind of fixpoint operator, and F\* was meant to be a sort of fixpoint of all those languages. The first version of F\* also had affine types and part of the intention then was to use affine types to encode separation logic—so the "\*" was also meant to evoke the separation logic "\*". But, the early affine versions of F\* never really did have separation logic. It took until almost a decade later to have a separation logic embedded in F\* (see Steel), though without relying on affine types.

# Part II

# **Programming and Proving with Total Functions**

The core design philosophy of  $F^*$  is that the type of a term (a program fragment) is a specification of its runtime behavior. We write e: t to mean that a term e has type t. Many terms can have the same type and the same term can have many types.

One (naive but useful) mental model is to think of a type as describing a set of values. For instance, the type int describes the set of terms which compute integer results, i.e., when you have e: int, then when e: int is reduced fully it produces a value in the set  $\{..., -2, -1, 0, 1, 2, ...\}$ . Similarly, the type bool is the type of terms that compute or evaluate to one of the values in the set  $\{true, false\}$ . Unlike many other languages, F\* allows defining types that describe arbitrary sets of values, e.g., the type that contains only the number 17, or the type of functions that factor a number into its primes.

When proving a program e correct, one starts by specifying the properties one is interested in as a type t and then trying to convince  $F^*$  that e has type t, i.e., deriving e: t.

The idea of using a type to specify properties of a program has deep roots in the connections between logic and computation. You may find it interesting to read about propositions as types, a concept with many deep mathematical and philosophical implications. For now, it suffices to think of a type t as a specification, or a statement of a theorem, and e: t as computer-checkable claim that the term e is a proof of the theorem t.

In the next few chapters we'll learn about how to program total functions and prove them correct.

**CHAPTER** 

**TWO** 

# **GETTING OFF THE GROUND**

To start writing some F\* programs, we'll need to learn some basics about the syntax of the language and some core concepts of types and functions.

# 2.1 Text Editors

F\* can be used as a command line tool with any text editor. If you're viewing this in the interactive online tutorial, you can use the Ace-based text editor alongside, which provides some basic conveniences like syntax highlighting. However, beyond casual use, most users of F\* rely on one of the following IDE plugins.

- fstar-mode.el, which provides several utilities for interactively editing and checking F\* files in emacs.
- fstar-vscode-assistant, which also provides interactive editing and checking support in VS Code.

The main benefit to using these IDE plugins is that they allow you to incrementally check just the changing suffix of an F\* file, rather than rechecking the entire file in batch mode. They also provide standard things like jumping to definitions, type of a symbol etc.

Both these plugins rely on a generic but custom interaction protocol implemented by the F\* compiler. It should be possible to implement IDE support similar to fstar-mode.el or fstar-vscode-assistant in your favorite plugin-capable editor.

# 2.2 Basic syntactic structure

An F\* program is a collection of modules, with each module represented by a single file with the filename extension .fst. Later, we'll see that a module's interface is in a separate .fsti file and allows hiding details of a module's implementation from a client module.

A module begins with the module's name (which must match the name of its file, i.e., module A is in A.fst) and contains a sequence of top-level signatures and definitions. Module names always begin with a capital letter.

• Signatures ascribe a type to a definition, e.g., val f: t.

Definitions come in several flavors: the two main forms we'll focus on when programming with total functions are

- possibly recursive definitions (let bindings, let [rec] f = e)
- and, inductive type definitions (datatypes, type t = | D1 : t1 | ... | Dn : tn)

In later sections, we'll see two other kinds of definition: user-defined indexed effects and sub-effects.

# 2.3 Comments

Block comments are delimited by (\* and \*). Line comments begin with //.

```
(* this is a
  block comment *)

//This is a line comment
```

# 2.4 Primitives

Every F\* program is checked in the context of some ambient primitive definitions taken from the core F\* module Prims.

#### 2.4.1 False

The type False has no elements. Since there are no terms that satisfy e: False, the type False is the type of unprovable propositions.

# 2.4.2 Unit

The type unit has a single element denoted (), i.e., (): unit.

# 2.4.3 Booleans

The type bool has two elements, true and false. Note, the lowercase false is a boolean constant, distinct from the uppercase False type.

The following primitive boolean operators are available, in decreasing order of precedence.

- not: Boolean negation (unary, prefix)
- &&: Boolean conjunction (binary, infix)
- ||: Boolean disjunction (binary, infix)

#### **Conditionals**

You can, of course, branch on a boolean with if/then/else

```
if b then 1 else 0

if b1 && b2 || b3
then 17
else 42
```

# 2.4.4 Integers

The type int represents unbounded, primitive mathematical integers. Its elements are formed from the literals 0, 1, 2,  $\ldots$ , and the following primitive operators, in decreasing order of precedence.

- -: Unary negation (prefix)
- -: Subtraction (infix)
- +: Addition (infix)
- /: Euclidean division (infix)
- %: Euclidean modulus (infix)
- op\_Multiply: Unfortunately, the traditional multiplication symbol \* is reserved by default for the tuple type constructor. Use the module FStar.Mul to treat \* as integer multiplication.
- <: Less than (infix)
- <=: Less than or equal (infix)
- > : Greater than (infix)
- >=: Greater than or equal (infix)

**Note:** F\* follows the OCaml style of no negative integer literals, instead negate a positive integer like (- 1).

# 2.5 Boolean refinement types

The F\* core library, Prims, defines the type of natural numbers as follows

```
let nat = x:int{x >= 0}
```

This is an instance of a boolean refinement type, whose general form is  $x:t \{ e \}$  where t is a type, and e is a booltyped term that may refer to the t-typed bound variable x. The term e *refines* the type t, in the sense that the set S denoted by t is restricted to those elements  $x \in S$  for which e evaluates to true.

That is, the type nat describes the set of terms that evaluate to an element of the set  $\{0, 1, 2, 3, \ldots\}$ .

But, there's nothing particularly special about nat. You can define arbitrary refinements of your choosing, e.g.,

```
let empty = x:int { false } //the empty set
let zero = x:int{ x = 0 } //the type containing one element `0`
let pos = x:int { x > 0 } //the positive numbers
let neg = x:int { x < 0 } //the negative numbers
let even = x:int { x % 2 = 0 } //the even numbers
let odd = x:int { x % 2 = 1 } //the odd numbers</pre>
```

If you're coming from a language like C or Java where a type primarily describes some properties about the representation of data in memory, this view of types as describing arbitrary sets of values may feel a bit alien. But, let it sink in a bit—types that carve out precise sets of values will let you state and check invariants about your programs that may otherwise have only been implicit in your code.

**Note:** Refinement types in F\* trace their lineage to F7, a language developed at Microsoft Research c. 2007 – 2011. Liquid Haskell is another language with refinement types. Those languages provide additional background and resources for learning about refinement types.

Boolean refinements are a special case of a more powerful form of propositional refinement type in  $F^*$ . Refinement types, in conjunction with dependent function types, are, in principle, sufficient to encode many kinds of logics for program correctness. However, refinement types are just one among several tools in  $F^*$  for program specification and proof.

# 2.5.1 Refinement subtyping

We have seen so far how to define a new refinement type, like nat or even. However, to make use of refinement types we need rules that allow us to:

- 1. check that a program term has a given refinement type, e.g., to check that **0** has type nat. This is sometimes called *introducing* a refinement type.
- 2. make use of a term that has a refinement type, e.g., given x : even we would like to be able to write x + 1, treating x as an int to add 1 to it. This is sometimes called *eliminating* a refinement type.

The technical mechanism in F\* that supports both these features is called *refinement subtyping*.

If you're used to a language like Java, C# or some other object-oriented language, you're familiar with the idea of subtyping. A type t is a subtype of s whenever a program term of type t can be safely treated as an s. For example, in Java, all object types are subtypes of the type Object, the base class of all objects.

For boolean refinement types, the subtyping rules are as follows:

- The type x:t { p } is a subtype of t. That is, given e : (x:t{p}), it is always safe to *eliminate* the refinement and consider e to also have type t.
- For a term e of type t (i.e., e : t), t is a subtype of the boolean refinement type x:t { p } whenever p[e / x] (p[e/x] is notation for the term p with the variable x replaced by e), is provably equal to true. In other words, to *introduce* e : t at the boolean refinement type x:t{ p }, it suffices to prove that the term p with e substituted for bound variable x, evaluates to true.

The elimination rule for refinement types (i.e., the first part above) is simple—with our intuition of types as sets, the refinement type  $x:t\{p\}$  refines the set corresponding to t by the predicate p, i.e., the  $x:t\{p\}$  denotes a subset of t, so, of course  $x:t\{p\}$  is a subtype of t.

The other direction is a bit more subtle:  $x:t\{p\}$  is only a subtype of p, for those terms e that validate p. You're probably also wondering about how to prove that p[e/x] evaluates to true—we will look at this in detail later. But, the short version is that  $F^*$ , by default, uses an SMT solver to prove such fact, though you can also use tactics and other techniques to do so.

# 2.5.2 An example

Given x: even, consider proving x + 1: odd; it takes a few steps:

- 1. The operator + is defined in F\*'s library. It expects both its arguments to have type int and returns an int.
- 2. To prove that the first argument x: even is a valid argument for +, we use refinement subtyping to eliminate the refinement and obtain x: int. The second argument 1:int already has the required type. Thus, x + 1: int.
- 3. To conclude that x + 1: odd, we need to introduce a refinement type, by proving that the refinement predicate of odd evaluates to true, i.e., x + 1 % 2 = 1. This is provable by SMT, since we started with the knowledge that x is even.

As such,  $F^*$  applies subtyping repeatedly to introduce and eliminate refinement types, applying it multiple times even to check a simple term like x + 1: odd.

# 2.6 Functions

We need a way to define functions to start writing interesting programs. In the core of  $F^*$ , functions behave like functions in maths. In other words, they are defined on their entire domain (i.e., they are total functions and always return a result) and their only observable behavior is the result they return (i.e., they don't have any side effect, like looping forever, or printing a message etc.).

Functions are first-class values in  $F^*$ , e.g., they can be passed as arguments to other functions and returned as results. While  $F^*$  provides several ways to define functions, the most basic form is the  $\lambda$  term, also called a function literal, an anonymous function, or a simply a *lambda*. The syntax is largely inherited from OCaml, and this OCaml tutorial provides more details for those unfamiliar with the language. We'll assume a basic familiarity with OCaml-like syntax.

# 2.6.1 Lambda terms

The term fun  $(x:int) \rightarrow x + 1$  defines a function, a lambda term, which adds 1 to its integer-typed parameter x. You can also let  $F^*$  infer the type of the parameter and write fun  $x \rightarrow x + 1$  instead.

# 2.6.2 Named functions

Any term in  $F^*$  can be given a name using a let binding. We'll want this to define a function once and to call it many times. For example, all of the following are synonyms and bind the lambda term fun  $x \to x + 1$  to the name incr

```
let incr = fun (x:int) -> x + 1
let incr (x:int) = x + 1
let incr x = x + 1
```

Functions can take several arguments and the result type of a function can also be annotated, if desired

```
let incr (x:int) : int = x + 1
let more_than_twice (x:int) (y:int) : bool = x > y + y
```

It's considered good practice to annotate all the parameters and result type of a named function definition.

**Note:** In addition to decorating the types of parameters and the results of function,  $F^*$  allows annotating any term e with its expected type t by writing e <: t. This is called a *type ascription*. An ascription instructs  $F^*$  to check that the term e has the type t. For example, we could have written

```
let incr = fun (x:int) -> (x + 1 <: int)
```

# 2.6.3 Recursive functions

Recursive functions in F\* are always named. To define them, one uses the let rec syntax, as shown below.

```
open FStar.Mul
let rec factorial (n:nat)
  : nat
  = if n = 0
    then 1
    else n * factorial (n - 1)
```

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This syntax defines a function names factorial with a single parameter n:nat, returning a nat. The definition of factorial is allowed to use the factorial recursively—as we'll see in a later chapter, ensuring that the recursion is well-founded (i.e., all recursive calls terminate) is key to F\*'s soundness. However, in this case, the proof of termination is automatic.

**Note:** Notice the use of *open FStar.Mul* in the example above. This brings the module *FStar.Mul* into scope and resolves the symbol \* to integer multiplication.

F\* also supports mutual recursion. We'll see that later.

# 2.7 Arrow types

Functions are the main abstraction facility of any functional language and their types are pervasive in  $F^*$ . In its most basic form, function types, or arrows, have the shape:

```
x:t0 \rightarrow t1
```

This is the type of a function that

- 1. receives an argument e of type t0, and
- 2. always returns a value of type t1[e / x], i.e., the type of the returned value depends on the argument e.

It's worth emphasizing how this differs from function types in other languages.

- F\*'s arrows are dependent—the type of the result depends on the argument. For example, we can write a function that returns a bool when applied to an even number and returns a string when applied to an odd number. Or, more commonly, a function whose result is one greater than its argument.
- In F\*'s core language, all functions are total, i.e., a function call always terminates after consuming a finite but unbounded amount of resources.

**Note:** That said, on any given computer, it is possible for a function call to fail to return due to resource exhaustion, e.g., running out of memory. Later, as we look at *effects*, we will see that  $F^*$  also supports writing non-terminating functions.

# 2.7.1 Some examples and common notation

1. Functions are *curried*. Functions that take multiple arguments are written as functions that take the first argument and return a function that takes the next argument and so on. For instance, the type of integer addition is:

```
val (+) : x:int -> y:int -> int
```

2. Not all functions are dependent and the name of the argument can be omitted when it is not needed. For example, here's a more concise way to write the type of (+):

```
val (+) : int -> int -> int
```

3. Function types can be mixed with refinement types. For instance, here's the type of integer division—the refinement on the divisor forbids division-by-zero errors:

```
val (/) : int -> (divisor:int { divisor <> 0 }) -> int
```

4. Dependence between the arguments and the result type can be used to state relationships among them. For instance, there are several types for the function let incr = (fun (x:int) -> x + 1):

```
val incr : int -> int
val incr : x:int -> y:int{y > x}
val incr : x:int -> y:int{y = x + 1}
```

The first type int -> int is its traditional type in languages like OCaml.

The second type  $x:int -> y:int\{y > x\}$  states that the returned value y is greater than the argument x.

The third type is the most precise:  $x:int \rightarrow y:int\{y = x + 1\}$  states that the result y is exactly the increment of the argument x.

5. It's often convenient to add refinements on arguments in a dependent function type. For instance:

Since this style is so common, and it is inconvenient to have to bind two names for the parameters x and y,  $F^*$  allows (and encourages) you to write:

```
val f : x:int{ x >= 1 } -> y:int{ y > x } -> z:int{ z > x + y }
```

6. To emphasize that functions in F\*'s core are total functions (i.e., they always return a result), we sometimes annotate the result type with the effect label "Tot". This label is optional, but especially as we learn about *effects*, emphasizing that some functions have no effects via the Tot label is useful. For example, one might sometimes write:

```
val f : x:int{ x >= 1 } -> y:int{ y > x } -> Tot (z:int{ z > x + y })
```

adding a Tot annotation on the last arrow, to indicate that the function has no side effects. One could also write:

```
val f : x:int{ x >= 1 } -> Tot (y:int{ y > x } -> Tot (z:int{ z > x + y }))
```

adding an annotation on the intermediate arrow, though this is not customary.

# 2.8 Exercises

This first example is just to show you how to run the tool and interpret its output.

```
module Part1.GettingOffTheGround
let incr (x:int) : int = x + 1
```

Notice that the program begins with a module declaration. It contains a single definition named incr. Definitions that appear at the scope of a module are called "top-level" definitions.

You have several options to try out these examples.

#### F\* online

To get started and for trying small exercises, the easiest way is via the online tutorial. If that's where you're reading this, you can just use the in-browser editor alongside which communicates with an F\* instance running in the cloud. Just click on this link to load the code of an exercise in the editor.

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That said, the online mode can be a bit slow, depending on the load at the server, and the editor is very minimalistic.

For anything more than small exercises, you should have a working local installation of the F\* toolchain, as described next.

#### F\* in batch mode

You can download pre-built F\* binaries from here.

Once you have a local installation, to check a program you can run the fstar at the command line, like so:

```
$ fstar Sample.fst
```

In response fstar should output:

```
Verified module: Sample
All verification conditions discharged successfully
```

This means that F\* attempted to verify the module named Sample. In doing so, it generated a some "verification conditions", or proof obligations, necessary to prove that the module is type correct, and that is discharged, or proved, all of them successfully.

#### F\* in emacs

Rather than running fstar in batch mode from the command line,  $F^*$  programmers using the emacs editor often use fstar-mode.el, an editor plugin that allows interactively checking an  $F^*$  program. If you plan to use  $F^*$  in any serious way, this is strongly recommended.

# 2.8.1 Many types for incr

Here are some types for incr, including some types that are valid and some others that are not.

This type claims that incr result is greater than its argument and F\* agrees—remember, the int type is unbounded, so there's no danger of the addition overflowing.

```
let incr1 (x:int) : y:int{y > x} = x + 1
```

This type claims that incr always returns a natural number, but it isn't true, since incrementing a negative number doesn't always produce a non-negative number.

F\* produces the following error message:

```
Sample.fst(11,26-11,31): (Error 19) Subtyping check failed; expected type Prims.nat; got type Prims.int; The SMT solver could not prove the query, try to spell your proof in more detail or increase fuel/ifuel (see also prims.fst(626, 18-626,24))

Verified module: Sample 1 error was reported (see above)
```

### **Source location**

The error message points to Sample.fst(11,26-11,31), a source range mentioned the file name, a starting position (line, column), and an ending position (line, column). In this case, it highlights the x + 1 term.

#### Severity and error code

The (Error 19) mentions a severity (i.e., Error, as opposed to, say, Warning), and an error code (19).

#### Error message

The first part of the message stated what you might expect:

```
Subtyping check failed; expected type Prims.nat; got type Prims.int
```

The rest of the message provides more details, which we'll ignore for now, until we've had a chance to explain more about how F\* interacts with the SMT solver. However, one part of the error message is worth pointing out now:

```
(see also prims.fst(626,18-626,24))
```

Error messages sometimes mention an auxiliary source location in a "see also" parenthetical. This source location can provide some more information about why  $F^*$  rejected a program—in this case, it points to the constraint x>=0 in the definition of nat in prims.fst, i.e., this is the particular constraint that  $F^*$  was not able to prove.

So, let's try again. Here's another type for incr, claiming that if its argument is a natural number then so is its result. This time  $F^*$  is happy.

Sometimes, it is convenient to provide a type signature independently of a definition. Below, the val incr4 provides only the signature and the subsequent let incr4 provides the definition—F\* checks that the definition is compatible with the signature.

```
val incr4 (x:int) : int
let incr4 x = x + 1
```

Try writing some more types for incr. (Load exercise.)

#### Some answers

```
let incr5 (x:int) : y:int{y = x + 1} = x + 1
let incr6 (x:int) : y:int{x = y - 1} = x + 1
let incr7 (x:int) : y:int{if x%2 = 0 then y%2 = 1 else y%2 = 0} = x + 1
```

### 2.8.2 Computing the maximum of two integers

Provide an implementation of the following signature:

```
val max (x:int) (y:int) : int
```

There are many possible implementations that satisfy this signature, including trivial ones like:

```
\begin{bmatrix} \text{let max } \mathbf{x} \ \mathbf{y} = \mathbf{0} \end{bmatrix}
```

Provide an implementation of max coupled with a type that is precise enough to rule out definitions that do not correctly return the maximum of x and y.

#### Some answers

```
val max (x:int) (y:int) : int
let max x y = if x >= y then x else y

val max1 (x:int) (y:int)
    : z:int{ z >= x && z >= y && (z = x || z = y)}

(continues on next page)
```

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```
let max1 x y = if x >= y then x else y
let max2 (x:int) (y:int)
 : z:int{z = max x y}
 = if x > y
   then x
   else y
```

## 2.8.3 More types for factorial

Recall the definition of factorial from earlier.

```
open FStar.Mul
let rec factorial (n:nat)
  : nat
 = if n = 0
    then 1
    else n * factorial (n - 1)
```

Can you write down some more types for factorial?

#### Some answers

```
let rec factorial1 (n:nat)
 : int
 = if n = 0
   then 1
   else n * factorial1 (n - 1)
let rec factorial2 (n:nat)
  : y:int{y>=1}
 = if n = 0
   then 1
   else n * factorial2 (n - 1)
```

#### 2.8.4 Fibonacci

Here's a doubly recursive function:

```
let rec fibonacci (n:nat)
  : nat
 = if n <= 1
   then 1
   else fibonacci (n - 1) + fibonacci (n - 2)
```

What other types can you give to it?

#### Some answers

```
val fibonacci_1 : x:int -> y:int{y >= 1 / y >= x / (if x>= 3 then y >= 2 else true)}
let rec fibonacci_1 n =
                                                                                (continues on next page)
```

(continued from previous page)

```
if n <= 1 then 1 else fibonacci_1 (n - 1) + fibonacci_1 (n - 2)

(* Try these other types too *)
  (* val fibonacci_1 : int -> int *)
  (* val fibonacci_1 : int -> nat *)
  (* val fibonacci_1 : int -> y:int{y>=1} *)
  (* val fibonacci_1 : x:int -> y:int{y>=1 /\ y >= x} *)
  (* val fibonacci_1 : int -> Tot (x:nat{x>0}) *)
```

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**CHAPTER** 

THREE

## POLYMORPHISM AND TYPE INFERENCE

In this chapter, we'll learn about defining type polymorphic functions, or how to work with generic types.

## 3.1 Type: The type of types

One characteristic of  $F^*$  (and many other dependently typed languages) is that it treats programs and their types uniformly, all within a single syntactic class. A type system in this style is sometimes called a *Pure Type System* or PTS.

In F\* (as in other PTSs) types have types too, functions can take types as arguments and return types as results, etc. In particular, the type of a type is Type, e.g., bool: Type, int: Type, int: Type etc. In fact, even Type has a type—as we'll see when we learn about *universes*.

# 3.2 Parametric polymorphism or generics

Most modern typed languages provide a way to write programs with generic types. For instance, C# and Java provide generics, C++ has templates, and languages like OCaml and Haskell have several kinds of polymorphic types.

In  $F^*$ , writing functions that are generic or polymorphic in types arises naturally as a special case of the *arrow types* that we have already learned about. For example, here's a polymorphic identity function:

```
let id : a:Type -> a -> a = fun a x -> x
```

There are a several things to note here:

- The type of id is an arrow type, with two arguments. The first argument is a : Type; the second argument is a term of type a; and the result also has the same type a.
- The definition of id is a lambda term with two arguments a: Type (corresponding to the first argument type) and x: a. The function returns x—it's an identity function on the second argument.

Just as with any function, you can write it instead like this:

```
let id (a:Type) (x:a) : a = x
```

To call id, one can apply it first to a type and then to a value of that type, as shown below.

```
let _ : bool = id bool true
let _ : bool = id bool false
let _ : int = id int (-1)
let _ : nat = id nat 17
```

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```
let _ : string = id string "hello"
let _ : int -> int = id (int -> int) (id int)
```

We've defined a function that can be applied to a value x:a for any type a. The last line there maybe requires a second read: we instantiated id to int -> int and then applied it to id instantiated to int.

### 3.3 Exercises

Let's try a few simple exercises. Click here for the exercise file.

Try defining functions with the following signatures:

```
      val apply (a b:Type) (f:a -> b) : a -> b

      val compose (a b c:Type) (f: b -> c) (g : a -> b) : a -> c
```

#### **Answer**

```
let apply a b f = fun x -> f x
let compose a b c f g = fun x -> f (g x)
```

How about writing down a signature for twice:

```
let twice a f x = compose a a a f f x
```

#### **Answer**

```
val twice (a:Type) (f: a -> a) (x:a) : a
```

It's quite tedious to have to explicitly provide that first type argument to id. Implicit arguments and type inference will help, as we'll see, next.

## 3.4 Type inference: Basics

Like many other languages in the tradition of Milner's ML, type inference is a central component in F\*'s design.

You may be used to type inference in other languages, where one can leave out type annotations (e.g., on variables, or when using type-polymorphic (aka generic) functions) and the compiler determines an appropriate type based on the surrounding program context. F\*'s type inference includes such a feature, but is considerably more powerful. Like in other dependently typed language, F\*'s inference engine is based on higher-order unification and can be used to infer arbitrary fragments of program text, not just type annotations on variables.

Let's consider our simple example of the definition and use of the identity function again

```
let id (a:Type) (x:a) : a = x
```

```
let _ : bool = id bool true
let _ : bool = id bool false
let _ : int = id int (-1)
let _ : nat = id nat 17
let _ : string = id string "hello"
let _ : int -> int = id (int -> int) (id int)
```

Instead of explicitly providing that first type argument when applying id, one could write it as follows, replacing the type arguments with an underscore \_.

```
let _ : bool = id _ true
let _ : bool = id _ false
let _ : int = id _ (-1)
let _ : nat = id _ 17
let _ : string = id _ "hello"
let _ : int -> int = id _ (id _)
```

The underscore symbols is a wildcard, or a hole in program, and it's the job of the F\* typechecker to fill in the hole.

**Note:** Program holes are a very powerful concept and form the basis of Meta-F\*, the metaprogramming and tactics framework embedded in F\*—we'll see more about holes in a later section.

## 3.5 Implicit arguments

Since it's tedious to write an \_ everywhere, F\* has a notion of *implicit arguments*. That is, when defining a function, one can add annotations to indicate that certain arguments can be omitted at call sites and left for the typechecker to infer automatically.

For example, one could write

```
let id (#a:Type) (x:a) : a = x
```

decorating the first argument a with a #, to indicate that it is an implicit argument. Then at call sites, one can simply write:

```
let _ : bool = id true
let _ : bool = id false
let _ : int = id (-1)
let _ : nat = id 17
let _ : string = id "hello"
let _ : int -> int = id id
```

And F\* will figure out instantiations for the missing first argument to id.

In some cases, it may be useful to actually provide an implicit argument explicitly, rather than relying on the  $F^*$  to pick one. For example, one could write the following:

```
let _ = id #nat 0
let _ = id #(x:int{x == 0}) 0
let _ = id #(x:int{x <> 1}) 0
```

In each case, we provide the first argument of id explicitly, by preceding it with a # sign, which instructs F\* to take the user's term rather than generating a hole and trying to fill it.

**CHAPTER** 

**FOUR** 

#### **EQUALITY**

Equality is a subtle issue that pervades the design of all dependent type theories, and  $F^*$  is no exception. In this first chapter, we briefly touch upon two different kinds of equality in  $F^*$ , providing some basic information sufficient for the simplest usages. In a *subsequent chapter*, we'll cover equality in much greater depth.

## 4.1 Decidable equality and eqtype

We've implicitly used the equality operator = already (e.g., when defining factorial). This is the *boolean* equality operator. Given two terms  $e_1$ : t and  $e_2$ : t, so long as t supports a notion of decidable equality,  $(e_1 = e_2)$ : bool.

To see why not all types support decidably equality, consider t to be a function type, like int  $\rightarrow$  int. To decide if two functions  $f_1$ ,  $f_2$ : int  $\rightarrow$  int are equal, we'd have to apply them to all the infinitely many integers and compare their results—clearly, this is not decidable.

The type eqtype is the type of types that support decidably equality. That is, given  $e_1$ : t and  $e_2$ : t, it is only permissible to compare  $e_1 = e_2$  if t: eqtype.

For any type definition,  $F^*$  automatically computes whether or not that type is an eqtype. We'll explain later exactly how  $F^*$  decides whether or not a type is an eqtype. Roughly, for  $F^*$  has built-in knowledge that various primitive types like integers and booleans support decidable equality. When defining a new type,  $F^*$  checks that all values of the new type are composed structurally of terms that support decidable equality. In particular, if an e:t may contain a sub-term that is a function, then t cannot be an eqtype.

As such, the type of the decidable equality operator is

```
val ( = ) (#a:eqtype) (x:a) (y:a) : bool
```

That is, x = y is well-typed only when x : a and y : a and a : eqtype.

**Note:** We see here a bit of  $F^*$  syntax for defining infix operators. Rather than only using the val or let notation with alphanumeric identifiers, the notation ( = ) introduces an infix operator defined with non-alphanumeric symbols. You can read more about this here.

# 4.2 Propositional equality

 $F^*$  offers another notion of equality, propositional equality, written ==. For *any type* t, given terms  $e_1$ ,  $e_2$ : t, the proposition  $e_1$  ==  $e_2$  asserts the (possibly undecidable) equality of  $e_1$  and  $e_2$ . The type of the propositional equality operator is shown below:

```
val ( == ) (#a:Type) (x:a) (y:a) : prop
```

Unlike decidable equality (=), propositional equality is defined for all types. The result type of (==) is prop, the type of propositions. We'll learn more about that in the *next chapter*.

**CHAPTER** 

**FIVE** 

### INTERFACING WITH AN SMT SOLVER

As mentioned *at the start of this section*, a type t represents a proposition and a term e: t is a proof of t. In many other dependently typed languages, exhibiting a term e: t is the only way to prove that t is valid. In F\*, while one can do such proofs, it is not the only way to prove a theorem.

By way of illustration, let's think about *Boolean refinement types*. As we've seen already, it is easy to prove  $17 : x:int\{x >= 0\}$  in  $F^*$ . Under the covers,  $F^*$  proves that (x >= 0) [17/x] reduces to true, yet no explicit term is given to prove this fact. Instead,  $F^*$  encodes facts about a program (including things like the semantics of arithmetic operators like >=) in the classical logic of an SMT solver and asks it (Z3 typically) to prove whether the formula 17 >= 0 is valid in a context including all encoded facts about a program. If Z3 is able to prove it valid,  $F^*$  accepts the formula as true, without ever constructing a term representing a proof of 17 >= 0.

This design has many important consequences, including, briefly:

- Trust: F\* implicitly trusts its encoding to SMT logic and the correctness of the Z3 solver.
- Proof irrelevance: Since no proof term is constructed for proofs done by SMT, a program cannot distinguish between different proofs of a fact proven by SMT.
- Subtyping: Since no proof term is constructed, a term like 17 can have many types, int, nat,  $x:int\{x = 17\}$ , etc. As mentioned *earlier*,  $F^*$  leverages this to support refinement subtyping.
- Undecidability: Since Z3 can check the validity of formulas in the entirety of its logic, including things like quantifying universally and existentially over infinite ranges, F\* does not restrict the the formulas checked for validity by Z3 to be boolean, or even decidable. Yes, typechecking in F\* is undecidable.

In this chapter, we'll learn about the classical logic parts of F\*, i.e., the parts that allow it to interface with an SMT solver.

**Note:** The beginning of this chapter is a little technical, even though we're not telling the full story behind F\*'s classical logic yet. If parts of it are hard to understand right now, here's what you need to know to before you *jump ahead*.

F\* let's you write quantified formulas, called propositions, like so

```
forall (x1:t1) ... (xn:tn). p
exists (x1:t1) ... (xn:tn). p
```

 $You \ can \ build \ propositions \ from \ booleans \ and \ conjunctions, \ disjunctions, \ negations, \ implications, \ and \ bi-implications:$ 

For example, one can say (as shown below) that for all natural numbers x and y, if the modulus x % y is 0, then there exists a natural number z such that x is z \* y.

```
forall (x:nat) (y:nat). x \% y = \emptyset \Longrightarrow (exists (z:nat). x = z * y)
```

 $F^*$  also has a notion of propositional equality, written ==, that can be used to state that two terms of any type are equal. In contrast, the boolean equality = can only be used on types that support decidable equality. For instance, for f1, f2: int -> int, you can write f1 == f2 but you cannot write f1 = f2, since two functions cannot be decidably compared for equality.

## 5.1 Propositions

The type prop defined in Prims is F\*'s type of proof-irrelevant propositions. More informally, prop is the type given to facts that are provable using the SMT solver's classical logic.

Propositions defined in prop need not be decidable. For example, for a Turing machine tm, the fact halts tm can be defined as a prop, although it is impossible to decide for an arbitrary tm whether tm halts on all inputs. This is contrast with bool, the type of booleans {true, false}. Clearly, one could not define halts tm as a bool, since one would be claiming that for halts is function that for any tm can decide (by returning true or false) whether or not tm halts on all inputs.

F\* will implicitly convert a bool to a prop when needed, since a decidable fact can be turned into a fact that may be undecidable. But, when using propositions, one can define things that cannot be defined in bool, including quantified formulae, as we'll see next.

## 5.2 Propositional connectives

Consider stating that factorial n always returns a positive number, when n:nat. In the *previous section* we learned that one way to do this is to give factorial a type like so.

```
val factorial (n:nat) : x:nat{x > 0}
```

Here's another way to state it:

```
forall (n:nat). factorial n > 0
```

What about stating that factorial n can sometimes return a value that's greater than n \* n?

```
exists (n:nat). factorial n > n * n
```

We've just seen our first use of universal and existential quantifiers.

#### 5.2.1 Quantifiers

A universal quantifier is constructed using the forall keyword. Its syntax has the following shape.

```
forall (x1:t1) ... (xn:tn) . p
```

The x1 ... xn are bound variables and signify the domain over which one the proposition p is quantified. That is, for all (x:t). p is valid when for all v: t the proposition p[v/x] is valid.

And existential quantifier has similar syntax, using the exists keyword.

```
exists (x1:t1) ... (xn:tn) . p
```

In this case, exists (x:t). p is valid when for some v: t the proposition p[v/x] is valid.

The scope of a quantifier extends as far to the right as possible.

As usual in  $F^*$ , the types on the bound variables can be omitted and  $F^*$  will infer them. However, in the case of quantified formulas, it's a good idea to write down the types, since the meaning of the quantifier can change significantly depending on the type of the variable. Consider the two propositions below.

```
exists (x:int). x < 0
exists (x:nat). x < 0</pre>
```

The first formula is valid by considering x = -1, while the second one is not—there is not natural number less than zero.

It is possible to quantify over any F\* type. This makes the quantifiers higher order and dependent. For example, one can write

```
forall (n:nat) (p: (x:nat{x >= n} -> prop)). p n
```

**Note:** The SMT solver uses a number of heuristics to determine if a quantified proposition is valid. As you start writing more substantial  $F^*$  programs and proofs, it will become important to learn a bit about these heuristics. We'll cover this in a later chapter. If you're impatient, you can also read about in on the  $F^*$  wiki.

## 5.2.2 Conjunction, Disjunction, Negation, Implication

In addition to the quantifiers, you can build propositions by combining them with other propositions, using the operators below, in decreasing order of precedence.

#### Negation

The proposition  $\sim p$  is valid if the negation of p is valid. This is similar to the boolean operator not, but applies to propositions rather than just booleans.

#### Conjunction

The proposition p / q is valid if both p and q are valid. This is similar to the boolean operator &&, but applies to propositions rather than just booleans.

#### Disjunction

The proposition  $p \neq q$  is valid if at least one of p and q are valid. This is similar to the boolean operator  $|\cdot|$ , but applies to propositions rather than just booleans.

#### **Implication**

The proposition  $p \implies q$  is valid if whenever p is valid, q is also valid.

#### **Double Implication**

The proposition  $p \iff q$  is valid if p and q are equivalent.

**Note:** This may come as a surprise, but these precedence rules mean that p / q ==> r is parsed as (p / q) ==> r rather than p / (q ==> r). When in doubt, use parentheses.

## 5.3 Atomic propositions

We've shown you how to form new propositions by building them from existing propositions using the connectives. But, what about the basic propositions themselves?

#### 5.3.1 Falsehood

The proposition False is always invalid.

#### 5.3.2 Truth

The proposition True is always valid.

## 5.3.3 Propositional equality

We learned in the previous chapter about the two different forms of equality. The type of propositional equality is

```
val ( == ) (#a:Type) (x:a) (y:a) : prop
```

Unlike decidable equality (=), propositional equality is defined for all types. The result type of (==) is prop, the type of propositions, meaning that x == y is a proof-irrelevant proposition.

#### Turning a Boolean into a proposition

Propositional equality provides a convenient way to turn a boolean into a proposition. For any boolean b, then term b == true is a prop. One seldom needs to do write this manually (although it does come up occasionally), since F\* will automatically insert a b==true if you're using a b:bool in a context where a prop was expected.

#### 5.3.4 Type vs. prop

This next bit is quite technical. Don't worry if you didn't understand it at first. It's enough to know at this stage that, just like automatically converting a boolean to *prop*, F\* automatically converts any type to prop, when needed. So, you can form new atomic propositions out of types.

Every well-typed term in F\* has a type. Even types have types, e.g., the type of int is Type, i.e., int: Type, bool: Type, and even prop: Type. We'll have to leave a full description of this to a later section, but, for now, we'll just remark that another way to form an atomic proposition is to convert a type to a proposition.

For any type t: Type, the type  $\_:$  unit  $\{t\}$ : prop. We call this "squashing" a type. This is so common, that  $F^*$  provides two mechanisms to support this:

- 1. All the propositional connectives, like p / q are designed so that both p and q can be types (i.e., p,q: Type), rather than propositions, and they implicitly squash their types.
- 2. The standard library, FStar. Squash, provides several utilities for manipulating squashed types.

### 5.4 Assertions

Now that we have a way to write down propositions, how can we ask F\* to check if those propositions are valid? There are several ways, the most common of which is an *assertion*. Here's an example:

```
let sqr_is_nat (x:int) : unit = assert (x * x >= 0)
```

This defines a function sqr\_is\_nat : int -> unit—meaning it takes a nat and always returns (). So, it's not very interesting as a function.

However, it's body contains an assertion that  $\mathbf{x} * \mathbf{x} >= \mathbf{0}$ . Now, many programming languages support runtime assertions—code to check some property of program when it executes. But, assertions in  $\mathbf{F}^*$  are different—they are checked by the  $\mathbf{F}^*$  compiler *before* your program is executed.

In this case, the assert instructs  $F^*$  to encode the program to SMT and to ask Z3 if x \* x >= 0 is valid for an arbitrary integer x:int. If Z3 can confirm this fact (which it can), then  $F^*$  accepts the program and no trace of the assertion is left in your program when it executes. Otherwise the program is rejected at compile time. For example, if we were to write

```
let sqr_is_pos (x:int) : unit = assert (x * x > 0)
```

Then, F\* complains with the following message:

```
Ch2.fst(5,39-5,50): (Error 19) assertion failed; The SMT solver could not prove the query, try to spell your proof in more detail or increase fuel/ifuel
```

You can use an assertion with any proposition, as shown below.

## 5.5 Assumptions

The dual of an assertion is an assumption. Rather than asking  $F^*$  and Z3 to prove a fact, an assumption allows one to tell  $F^*$  and Z3 to accept that some proposition is valid. You should use assumptions with care—it's easy to make a mistake and assume a fact that isn't actually true.

The syntax of an assumption is similar to an assertion. Here, below, we write assume (x < 0) to tell  $F^*$  to assume x is non-zero in the rest of the function. That allows  $F^*$  to prove that the assertion that follows is valid.

```
let sqr_is_pos(x:int) = assume(x <> 0); assert(x * x > 0)
```

Of course, the assertion is not valid for all x—it's only valid for those x that also validate the preceding assumption. Just like an assert, the type of assume p is unit.

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There's a more powerful form of assumption, called an admit. The term admit() can given any type you like. For example,

```
\begin{cases} let \ sqr_is_pos \ (x:int) : \ y:nat\{y > 0\} = admit() \end{cases}
```

Both assume and admit can be helpful when you're working through a proof, but a proof isn't done until it's free of them.

**CHAPTER** 

SIX

### INDUCTIVE TYPES AND PATTERN MATCHING

In this chapter, you'll learn how to define new types in F\*. These types are called *inductive types*, or, more informally, datatypes. We'll also learn how to define functions over these inductive types by pattern matching and to prove properties about them.

**Note:** We'll only cover the most basic forms of inductive types here. In particular, the types we show here will not make use of indexing or any other form of dependent types—we'll leave that for a later chapter.

### 6.1 Enumerations

We've seen that unit is the type with just one element () and that bool is the type with two elements, true and false.

You can define your own types with an enumeration of elements, like so.

This introduces a new type three: Type, and three *distinct* constants One\_of\_three: three, Two\_of\_three: three, Three\_of\_three: three. These constants are also called "constructors" or "data constructors". The name of a constructor must begin with an uppercase letter.

**Note:** In this case, it may seem redundant to have to write the type of each constructor repeatedly—of course they're all just constructors of the type three. In this case, F\* will allow you to just write

As we start to use indexed types, each constructor can build a different instance of the defined type, so it will be important to have a way to specify the result type of each constructor. For uniformity, throughout this book, we'll always annotate the types of constructors, even when not strictly necessary.

F\* can prove that they are distinct and that these are the only terms of type three.

To write functions that case analyze these new types, one uses the match construct. The syntax of match in  $F^*$  is very similar to OCaml or  $F^*$ . We'll assume that you're familiar with its basics. As we go, we'll learn about more advanced ways to use match.

Here are some examples.

#### 6.1.1 Discriminators

These functions test whether x: three matches a given constructor, returning a bool in each case. Since it's so common to write functions that test whether a value of an inductive type matches one of its constructors,  $F^*$  automatically generates these functions for you. For example, instead of writing

```
let three_as_int (x:three)
   : int
   = if is_one x then 1
    else if is_two x then 2
    else 3
```

One can write:

```
let three_as_int' (x:three)
  : int
  = if One_of_three? x then 1
    else if Two_of_three? x then 2
    else 3
```

In other words, for every constructor T of an inductive type t,  $F^*$  generates a function named T? (called a "discriminator") which tests if a v:t matches T.

#### 6.1.2 Exhaustiveness

Of course, an even more direct way of writing three\_as\_int is

```
let three_as_int'' (x:three)
  : int
  = match x with
    | One_of_three -> 1
    | Two_of_three -> 2
    | Three_of_three -> 3
```

Every time you use a match, F\* will make sure to prove that you are handling all possible cases. Try omitting one of the cases in three\_as\_int above and see what happens.

Exhaustiveness checking in F\* is a semantic check and can use the SMT solver to prove that all cases are handled appropriately. For example, you can write this:

```
let only_two_as_int (x:three { not (Three_of_three? x) })
   : int
   = match x with
   | One_of_three -> 1
   | Two_of_three -> 2
```

The refinement on the argument allows F\* to prove that the Three\_of\_three case in the pattern is not required, since that branch would be unreachable anyway.

# 6.2 Tuples

The next step from enumerations is to define composite types, e.g., types that are made from pairs, triples, quadruples, etc. of other types. Here's how

```
type tup2 (a:Type) (b:Type) =
    | Tup2 : fst:a -> snd:b -> tup2 a b

type tup3 a b c =
    | Tup3 : fst:a -> snd:b -> thd:c -> tup3 a b c
```

The type definition for tup2 a b states that for any types a : Type and b : Type, Tup2 :  $a \rightarrow b \rightarrow tup2$  a b. That is, Tup2 is a constructor of tup2, such that given x:a and y:b, Tup2 x y : tup2 a b.

The other types tup3 and tup4 are similar—the type annotations on the bound variables can be inferred.

These are inductive types with just one case—so the discriminators Tup2?, Tup3?, and Tup4? aren't particularly useful. But, we need a way to extract, or *project*, the components of a tuple. You can do that with a match.

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#### 6.2.1 Projectors

These projectors are common enough that  $F^*$  auto-generates them for you. In particular, for any data constructor T of type x1:t1 -> ... -> xn:tn -> t,  $F^*$  auto-generates the following function:

```
• T?.xi : y:t{T? y} -> ti
```

That is, T?.xi is a function which when applied to a y:t in case T? y, returns the xi component of T x1 ... xn.

In the case of our tup2 and tup3 types, we have

- Tup2?.fst, Tup2?.snd
- Tup3?.fst, Tup3?.snd, Tup3?.thd

### 6.2.2 Syntax for tuples

Since tuples are so common, the module FStar.Pervasives.Native.fst defines tuple types up to arity 14. So, you shouldn't have to define tup2 and tup3 etc. by yourself.

The tuple types in FStar.Pervasives.Native come with syntactic sugar.

- You can write a & b instead of the tup2 a b; a & b & c instead of tup3 a b c; and so on, up to arity 14.
- You can write x, y instead of Tup2 x y; x, y, z instead of Tup3 x y z; an so on, up to arity 14.
- You can write x.\_1, x.\_2, x.\_3, etc. to project the field i of a tuple whose arity is at least i.

That said, if you're using tuples beyond arity 4 or 5, it's probably a good idea to define a *record*, as we'll see next—since it can be hard to remember what the components of a large tuple represent.

### 6.2.3 Records

A record is just a tuple with user-chosen names for its fields and with special syntax for constructing then and projecting their fields. Here's an example.

```
type point3D = { x:int; y:int; z:int}

let origin = { y=0; x=0; z=0 }

let dot (p0 p1:point3D) = p0.x * p1.x + p0.y * p1.y + p0.z * p1.z

let translate_X (p:point3D) (shift:int) = { p with x = p.x + shift}

let is_origin (x:point3D) =
    match x with
    | {z=0;y=0;x=0} -> true
    | _ -> false
```

- A record type is defined using curly braces {}. See type point3D
- A record value is also constructed using curly braces, with an assignment for each field of the record. The fields need not be given in order. See origin.
- To access the fields of a record, you can use the dot notation p.x; See dot, which computes a dot product using
  dot notation.
- Records also support the with notation to construct a new record whose fields are the same as the old record, except for those fields mentioned after the with. That is, translate\_X p shift returns { x = p.x + shift; y = p.y; z = p.z}.
- Records can also be used to pattern match a value. For example, in is\_origin, we match the fields of the record (in any order) against some patterns.

# 6.3 Options

Another common type from F\*'s standard library is the option type, which is useful to represent a possibly missing value.

Consider implementing a function to divide x / y, for two integers x and y. This function cannot be defined when y is zero, but it can be defined partially, by excluding the case where y = 0, as shown below. (Of course, one can also refine the domain of the function to forbid y = 0, but we're just trying to illustrate the option type here.)

```
let try_divide (x y:int)
  : option int
  = if y = 0 then None else Some (x / y)
let divide (x:int) (y:int{y<>0}) = x / y
```

Like most other functional languages,  $F^*$  does not have a null value. Whenever a value may possibly be null, one typically uses the option type, using None to signify null and Some v for the non-null case.

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## 6.4 Unions, or the either type

FStar.Pervasives also defines the either type, shown below.

```
type either a b =
    | Inl : v: a -> either a b
    | Inr : v: b -> either a b
```

The type either a b represents a value that could either be Inl v with v:a, or Inr v with v:b. That is, either a b is a tagged union of the a and b. It's easy to write functions to analyze the tag Inl (meaning it's "in the left case") or Inr ("in the right case") and compute with the underlying values. Here's an example:

The same\_case x y function decides if the two unions are both simultaneously in the left or right case.

Then, in sum x y, with a refinement that x and y are in the same case, we can handle just two cases (when they are both in left, or both in right) and  $F^*$  can prove that the case analysis is exhaustive. In the left case, the underlying values are boolean, so we combine them with  $| \cdot |$ ; in the right case, the underlying values are integers, so we combine them with +; and return them with the appropriate tag. The type of the result z:either bool  $int\{Inl?\ z <==> Inl?\ x\}$  shows that the result has the same case as x (and hence also y). We could have written the result type as z:either bool  $int\{Same\_case\ z\ x\}$ .

### 6.5 Lists

All the types we've seen so far have been inductive only in a degenerate sense—the constructors do not refer to the types they construct. Now, for our first truly inductive type, a list.

Here's the definition of list from Prims:

```
type list a =
   | Nil : list a
   | Cons : hd:a -> tl:list a -> list a
```

The list type is available implicitly in all  $F^*$  programs and we have special (but standard) syntax for the list constructors:

```
[] is Nil[v1; ...; vn] is Cons v1 ... (Cons vn Nil)hd :: tl is Cons hd tl.
```

You can always just write out the constructors like Nil and Cons explicitly, if you find that useful (e.g., to partially apply Cons hd: list a -> list a).

## 6.5.1 Length of a list

Let's write some simple functions on lists, starting with computing the length of a list.

```
let rec length #a (1:list a)
   : nat
   = match 1 with
   | [] -> 0
   | _ :: tl -> 1 + length tl
```

The length function is recursive and implicitly polymorphic in a type a. For any list 1: list a, length 1 returns a nat. The definition pattern matches on the list and calls length recursively on the tail of list, until the [] case is reached.

### 6.6 Exercises

Click here for the exercise file.

Here's the definition of append, a function that concatenates two lists. Can you give it a type that proves it always returns a list whose length is the sum of the lengths of its arguments?

```
let rec append 11 12
    = match 11 with
    | [] -> 12
    | hd :: tl -> hd :: append tl 12
```

#### **Answer**

```
val append (#a:Type) (l1 l2:list a)
: l:list a { length l = length l1 + length l2 }
```

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**CHAPTER** 

SEVEN

### PROOFS OF TERMINATION

It's absolutely crucial to the soundness of F\*'s core logic that all functions terminate. Otherwise, one could write non-terminating functions like this:

```
let rec loop (x:unit) : False = loop x
```

and show that loop (): False, i.e., we'd have a proof term for False and the logic would collapse.

In the previous chapter, we just saw how to define recursive functions to *compute the length of list* and to *append two lists*. We also said *earlier* that all functions in F\*'s core are *total*, i.e., they always return in a finite amount of time. So, you may be wondering, what is it that guarantees that recursive function like length and append actually terminate on all inputs?

The full details of how F\* ensures termination of all functions in its core involves several elements, including positivity restrictions on datatype definitions and universe constraints. However, the main thing that you'll need to understand at this stage is that F\* includes a termination check that applies to the recursive definitions of total functions. The check is a semantic check, not a syntactic criterion, like in some other dependently typed languages.

We quickly sketch the basic structure of the  $F^*$  termination check on recursive functions—you'll need to understand a bit of this in order to write more interesting programs.

# 7.1 A well-founded partial order on terms

In order to prove a function terminating in F\* one provides a *measure*: a pure expression depending on the function's arguments. F\* checks that this measure strictly decreases on each recursive call. The measure for the arguments of the call is compared to the measure for the previous call according to a well-founded partial order on F\* terms. We write vI << v2 when vI precedes v2 in this order.

**Note:** A relation R is a well-founded partial order on a set S if, and only if, R is a partial order on S and there are no infinite descending chains in S related by R. For example, taking S to be nat, the set of natural numbers, the integer ordering < is a well-founded partial order (in fact, it is a total order).

Since the measure strictly decreases on each recursive call, and there are no infinite descending chains, this guarantees that the function eventually stops making recursive calls, i.e., it terminates.

### 7.1.1 The precedes relation

Given two terms v1:t1 and v2:t2, we can prove v1 << v2 if any of the following are true:

1. The ordering on integers:

```
t1 = nat and t2 = nat and v1 < v2
```

Negative integers are not related by the << relation, which is only a \_partial\_ order.

2. The sub-term ordering on inductive types

If  $v2 = D \ u1 \dots un$ , where D is a constructor of an inductive type fully applied to arguments u1 to un, then  $v1 \ll v2$  if either

- v1 = ui for some i, i.e., v1 is a sub-term of v2
- v1 = ui x for some i and x, i.e., v1 is the result of applying a sub-term of v2 to some argument x.

## 7.2 Why length terminates

Let's look again at the definition of length and see how F\* checks that it terminates, i.e.,

```
let rec length #a (1:list a)
   : nat
   = match 1 with
   | [] -> 0
   | _ :: tl -> 1 + length tl
```

First off, the definition of length above makes use of various syntactic shorthands to hide some details. If we were to write it out fully, it would be as shown below:

```
let rec length #a (1:list a)
   : Tot nat (decreases 1)
   = match 1 with
   | [] -> 0
   | _ :: tl -> 1 + length tl
```

The main difference is on the second line. As opposed to just writing the result type of length, in full detail, we write Tot nat (decreases 1). This states two things

- The Tot nat part states that length is a total function returning a nat, just as the nat did before.
- The additional (decreases 1) specifying a *measure*, i.e., the quantity that decreases at each recursive call according the well-founded relation <<.

To check the definition, F\* gives the recursively bound name (length in this case) a type that's guarded by the measure. I.e., for the body of the function, length has the following type:

```
#a:Type -> m:list a{ m << l } -> nat
```

This is to say that when using length to make a recursive call, we can only apply it to an argument m << 1, i.e., the recursive call can only be made on an argument m that precedes the current argument 1. This is enough to ensure that the recursive calls will eventually bottom out, since there are no infinite descending chains related by <<.

In the case of length, we need to prove at the recursive call length tl that tl :  $(m : list a \{ m << 1 \})$ , or, equivalently that tl << l is valid. But, from the sub-term ordering on inductive types, l = Cons \_ tl, so tl << l is indeed provable and everything checks out.

## 7.3 Lexicographic orderings

 $F^*$  also provides a convenience to enhance the well-founded ordering << to lexicographic combinations of <<. That is, given two lists of terms v1, ..., vn and u1, ..., un,  $F^*$  accepts that the following lexicographic ordering:

```
v1 << u1 \/ (v1 == u1 /\ (v2 << u2 \/ (v2 == u2 /\ ( ... vn << un))))
```

is also well-founded. In fact, it is possible to prove in F\* that this ordering is well-founded, provided << is itself well-founded.

Lexicographic ordering are common enough that  $F^*$  provides special support to make it convenient to use them. In particular, the notation:

```
\[ \%[v1; v2; \ldots; vn] \ldots \%[u1; u2; \ldots; un] \]
```

is shorthand for:

Let's have a look at lexicographic orderings at work in proving that the classic ackermann function terminates on all inputs.

```
let rec ackermann (m n:nat)
  : Tot nat (decreases %[m;n])
  = if m=0 then n + 1
    else if n = 0 then ackermann (m - 1) 1
    else ackermann (m - 1) (ackermann m (n - 1))
```

The decreases %[m;n] syntax tells  $F^*$  to use the lexicographic ordering on the pair of arguments m, n as the measure to prove this function terminating.

When defining ackermann m n, for each recursive call of the form ackermann m' n',  $F^*$  checks that m' (m';n'] << m, i.e.,  $F^*$  checks that either

```
m' << m, or</li>m' = m and n' << n</li>
```

There are three recursive calls to consider:

- 1. ackermann (m 1) 1: In this case, since we know that m > 0, we have m 1 << m, due to the ordering on natural numbers. Since the ordering is lexicographic, the second argument is irrelevant for termination.
- 2. ackermann m (n 1): In this case, the first argument remained the same (i.e., it's still m), but we know that n > 0 so n 1 << n by the natural number ordering.
- 3. ackermann (m 1) (ackermann m (n 1)): Again, like in the first case, the first argument m 1 << m, and the second is irrelevant for termination.

### 7.4 Default measures

As we saw earlier, F\* allows you to write the following code, with no decreases clause, and it still accepts it.

```
let rec length #a (1:list a)
   : nat
   = match 1 with
   | [] -> 0
   | _ :: tl -> 1 + length tl
```

For that matter, you can leave out the decreases clause in ackermann and F\* is okay with it.

```
let rec ackermann (m n:nat)
  : nat
  = if m=0 then n + 1
   else if n = 0 then ackermann (m - 1) 1
   else ackermann (m - 1) (ackermann m (n - 1))
```

This is because F\* uses a simple heuristic to choose the decreases clause, if the user didn't provide one.

The *default* decreases clause for a total, recursive function is the lexicographic ordering of all the non-function-typed arguments, taken in order from left to right.

That is, the default decreases clause for ackermann is exactly decreases %[m; n]; and the default for length is just decreases %[a; 1] (which is equivalent to decreases 1). So, you needn't write it.

On the other hand, it you were to flip the order of arguments to ackermann, then the default choice of the measure would not be correct—so, you'll have to write it explicitly, as shown below.

```
let rec ackermann_flip (n m:nat)
  : Tot nat (decreases %[m;n])
  = if m=0 then n + 1
    else if n = 0 then ackermann_flip 1 (m - 1)
    else ackermann_flip (ackermann (n - 1) m) (m - 1)
```

#### 7.5 Mutual recursion

F\* also supports mutual recursion and the same check of proving that a measure of the arguments decreases on each (mutually) recursive call applies.

For example, one can write the following code to define a binary tree that stores an integer at each internal node—the keyword and allows defining several types that depend mutually on each other.

To increment all the integers in the tree, we can write the mutually recursive functions, again using and to define incr\_tree and incr\_node to depend mutually on each other. F\* is able to prove that these functions terminate, just by using the default measure as usual.

```
type tree =
  | Terminal : tree
  | Internal : node -> tree

and node = {
  left : tree;
  data : int;
```

(continues on next page)

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**Note:** Sometimes, a little trick with lexicographic orderings can help prove mutually recursive functions correct. We include it here as a tip, you can probably skip it on a first read.

```
let rec foo (l:list int)
   : Tot int (decreases %[1;0])
   = match 1 with
   | [] -> 0
   | x :: xs -> bar xs
and bar (l:list int)
   : Tot int (decreases %[1;1])
   = foo 1
```

What's happening here is that when foo 1 calls bar, the argument xs is legitimately a sub-term of 1. However, bar 1 simply calls back foo 1, without decreasing the argument. The reason this terminates, however, is that bar can freely call back foo, since foo will only ever call bar again with a smaller argument. You can convince  $F^*$  of this by writing the decreases clauses shown, i.e., when bar calls foo, 1 doesn't change, but the second component of the lexicographic ordering does decrease, i.e., 0 << 1.

# 7.6 The termination check, precisely

Having seen a few examples at work, we can now describe how the termination check works in general.

**Note:** We use a slightly more mathematical notation here, so that we can be precise. If it feels unfamiliar, you needn't understand this completely at first. Continue with the examples and refer back to this section, if and when you feel like a precise description would be helpful.

When defining a recursive function

```
f(\overline{x:t}) : Tot r (decreases m) = e
```

i.e., f is a function with several arguments  $x1:t1,...,x_n:t_n$ , returning r with measure m, mutually recursively with

other functions of several arguments at type:

```
\begin{array}{c} f_1 \; (\overline{x_1:t_1}) \; : \; \mathsf{Tot} \; \mathsf{r}_1 \; (\mathsf{decreases} \; \mathsf{m}_1) \\ & \cdots \\ f_n \; (\overline{x_n:t_n}) \; : \; \mathsf{Tot} \; \mathsf{r}_n \; (\mathsf{decreases} \; \mathsf{m}_n) \end{array}
```

we check the definition of the function body of f (i.e., e) with all the mutually recursive functions in scope, but at types that restrict their domain, in the following sense:

That is, each function in the mutually recursive group can only be applied to arguments that precede the current formal parameters of f according to the annotated measures of each function.

### 7.7 Exercise: Fibonacci in linear time

Click here for the exercise file.

Here's a function to compute the n-th Fibonacci number.

```
let rec fibonacci (n:nat)
  : nat
  = if n <= 1
    then 1
    else fibonacci (n - 1) + fibonacci (n - 2)</pre>
```

Here's a more efficient, tail-recursive, linear-time variant.

```
let rec fib a b n =
    match n with
    | 0 -> a
    | _ -> fib b (a+b) (n-1)

let fibonacci n = fib 1 1 n
```

Add annotations to the functions to get F\* to accept them, in particular, proving that fib terminates.

#### **Answer**

## 7.8 Exercise: Tail-recursive reversal

Click here for the exercise file.

Here is a function to reverse a list:

```
let rec rev #a (1:list a)
  : list a
  = match 1 with
  | [] -> []
   | hd::tl -> append (rev tl) hd
```

But, it is not very efficient, since it is not tail recursive and, worse, it is quadratic, it traverses the reversed tail of the list each time to add the first element to the end of it.

This version is more efficient, because it is tail recursive and linear.

```
let rec rev_aux 11 12 =
  match 12 with
  | [] -> 11
  | hd :: tl -> rev_aux (hd :: 11) tl

let rev l = rev_aux [] l
```

Add type annotations to rev\_aux and rev, proving, in particular, that rev\_aux terminates.

#### Answer

```
let rec rev_aux #a (l1 l2:list a)
   : Tot (list a) (decreases l2)
   = match l2 with
   | []     -> l1
   | hd :: tl -> rev_aux (hd :: l1) tl

let rev #a (l:list a) : list a = rev_aux [] l
```

**CHAPTER** 

**EIGHT** 

### LEMMAS AND PROOFS BY INDUCTION

Let's say you wrote the factorial function and gave it the type nat  $\rightarrow$  nat. Later, you care about some other property about factorial, e.g., that if x > 2 then factorial x > x. One option is to revise the type you wrote for factorial and get  $F^*$  to reprove that it has this type. But this isn't always feasible. What if you also wanted to prove that if x > 3 then factorial x > 2 \* x. Clearly, polluting the type of factorial with all these properties that you may or may not care about is impractical.

You could write assertions to ask F\* to check these properties, e.g.,

```
\begin{bmatrix} let _ = assert (forall (x:nat). x > 2 ==> factorial x > 2) \end{bmatrix}
```

But,  $F^*$  complains saying that it couldn't prove this fact. That's not because the fact isn't true—recall, checking the validity of assertions in  $F^*$  is undecidable. So, there are facts that are true that  $F^*$  may not be able to prove, at least not without some help.

In this case, proving this property about factorial requires a proof by induction.  $F^*$  and Z3 cannot do proofs by induction automatically—you will have to help  $F^*$  here by writing a *lemma*.

# 8.1 Introducing lemmas

A lemma is a function in  $F^*$  that always returns the ():unit value. However, the type of lemma carries useful information about which facts are provable.

Here's our first lemma:

```
let rec factorial_is_positive (x:nat)
    : u:unit{factorial x > 0}
    = if x = 0 then ()
    else factorial_is_positive (x - 1)
```

There's a lot of information condensed in that definition. Let's spell it out in detail:

- factorial\_is\_positive is a recursive function with a parameter x:nat
- The return type of factorial\_is\_positive is a refinement of unit, namely u:unit{factorial x > 0}. That says that the function always returns (), but, additionally, when factorial\_is\_positive x returns (which it always does, since it is a total function) it is safe to conclude that factorial x > 0.
- The next three lines prove the lemma using a proof by induction on x. The basic concept here is that by programming total functions, we can write proofs about other pure expressions. We'll discuss such proofs in detail in the remainder of this section.

### 8.1.1 Some syntactic shorthands for Lemmas

Lemmas are so common in  $F^*$  that it's convenient to have special syntax for them. Here's another take at our proof by factorial x > 0

The type x:t -> Lemma (requires pre) (ensures post) is the type of a function

- that can be called with an argument v:t
- the argument must satisfies the precondition pre[v/x]
- the function always returns a unit
- and ensures that the postcondition post[v/x] is valid

The type is equivalent to x:t{pre} -> u:unit{post}.

When the precondition pre is trivial, it can be omitted. One can just write:

```
Lemma (ensures post)
```

or even

```
Lemma post
```

#### 8.1.2 A proof by induction, explained in detail

Let's look at this lemma in detail again—why does it convince  $F^*$  that factorial x > 0?

- It is a proof by induction on  $\mathbf{x}$ . Proofs by induction in  $F^*$  are represented by total recursive functions. The fact that it is total is extremely important—it ensures that the inductive argument is well-founded, i.e., that the induction hypothesis is only applied correctly on strictly smaller arguments.
- The base case of the induction is when x=0. In this case,  $F^* + Z3$  can easily prove that factorial 0 > 0, since this just requires computing factorial 0 to 1 and checking 1 > 0.
- What remains is the case where x > 0.
- In the inductive case, the type of the recursively bound factorial\_is\_pos represents the induction hypothesis. In this case, its type is

```
y:int {y < x} \rightarrow Lemma (requires y >= 0) (ensures factorial y > 0)
```

In other words, the type of recursive function tells us that for all y that are smaller than that current argument x and non-negative, it is safe to assume that factorial y > 0.

• By making a recursive call on x-1,  $F^*$  can conclude that factorial (x-1) > 0.

• Finally, to prove that factorial x > 0, the solver figures out that factorial x = x \* factorial (x - 1). From the recursive lemma invocation, we know that factorial (x - 1) > 0, and since we're in the case where x > 0, the solver can prove that the product of two positive numbers must be positive.

## 8.2 Exercises: Lemmas about integer functions

Click here for the exercise file.

#### 8.2.1 Exercise 1

Try proving the following lemmas about factorial:

#### **Answer**

#### 8.2.2 Exercise 2

Try proving the following lemmas about fibonacci:

```
let rec fibonacci (n:nat)
  : nat
  = if n <= 1
    then 1
    else fibonacci (n - 1) + fibonacci (n - 2)

val fibonacci_greater_than_arg (n:nat{n >= 2})
    : Lemma (fibonacci n >= n)
```

Answer (Includes two proofs and detailed explanations)

```
let rec fibonacci_greater_than_arg (n:nat{n >= 2})
    : Lemma (fibonacci n >= n)
    = if n <= 3 then ()
    else (
        fibonacci_greater_than_arg (n - 1);
        fibonacci_greater_than_arg (n - 2)
    )</pre>
```

Let's have a look at that proof in some detail. It's much like the proof by induction we discussed in detail earlier, except now we have two uses of the induction hypothesis.

• It's a proof by induction on  $n:nat\{n \ge 2\}$ , as you can tell from the let rec.

- The base cases are when n = 2 and n = 3. In both these cases, the solver can simply compute fibonacci n and check that it is greater than n.
- Otherwise, in the inductive case, we have n >= 4 and the induction hypothesis is the type of the recursive function:

```
m:nat\{m >= 2 / \ m < n\} -> Lemma (fibonacci <math>m >= m)
```

• We call the induction hypothesis twice and get:

```
fibonacci (n - 1) >= n - 1
fibonacci (n - 2) >= n - 2
```

• To conclude, we show:

As you can see, once you set up the induction, the SMT solver does a lot of the work.

Sometimes, the SMT solver can even find proofs that you might not write yourself. Consider this alternative proof of fibonacci  $n \ge n$ .

```
let rec fib_greater_than_arg (n:nat{n >= 2})
    : Lemma (fibonacci n >= n)
    = if n = 2 then ()
    else (
       fib_greater_than_arg (n - 1)
    )
```

This proof works with just a single use of the induction hypothesis. How come? Let's look at it in detail.

- 1. It's a proof by induction on  $n:nat\{n >= 2\}$ .
- 2. The base case is when n=2. It's easy to compute fibonacci 2 and check that it's greater than or equal to 2.
- 3. In the inductive case, we have:

```
n >= 3
```

4. The induction hypothesis is:

```
m:nat\{m >= 2 / m < n\} \rightarrow Lemma (fibonacci m >= m)
```

5. We apply the induction hypothesis to n - 1 and get

```
fibonacci (n - 1) >= n - 1
```

6. We have:

```
fibonacci n = //definition
fibonacci (n - 1) + fibonacci (n - 2) >= //from 5
(n - 1) + fibonacci (n - 2)
```

7. So, our goal is now:

```
(n - 1) + fibonacci (n - 2) >= n
```

- 8. It suffices if we can show fibonacci (n 2) >= 1
- 9. From (2) and the definition of fibonacci we have:

```
fibonacci (n - 1) = //definition
fibonacci (n - 2) + fibonacci (n - 3) >= //from 5
n - 1 >= // from 3
2
```

10. Now, suppose for contradiction, that fibonacci (n - 2) = 0.

```
10.1. Then, from step 9, we have fibonacci (n-3) >= 2
```

10.2 If n=3, then fibonacci 0 = 1, so we have a contradiction.

10.3 If n > 3, then

```
10.3.1. fibonacci (n-2) = fibonacci (n-3) + fibonacci (n-4), by definition
```

```
10.3.2. fibonacci (n-3) + fibonacci (n-4) >= fibonacci (n-3), since fibonacci
```

(n-4): nat.

10.3.3. fibonacci (n-2) >= fibonacci (n-3), using 10.3.1 and 10.3.2

10.3.4. fibonacci (n-2) >= 2, using 10.1

10.3.5. But, 10.3.4 contradicts 10; so the proof is complete.

You probably wouldn't have come up with this proof yourself, and indeed, it took us some puzzling to figure out how the SMT solver was able to prove this lemma with just one use of the induction hypothesis. But, there you have it. All of which is to say that the SMT solver is quite powerful!

# 8.3 Exercise: A lemma about append

*Earlier*, we saw a definition of append with the following type:

```
val append (#a:Type) (l1 l2:list a)
: l:list a{length l = length l1 + length l2}
```

Now, suppose we were to define app', a version of append with a weaker type, as shown below.

```
let rec app #a (l1 l2:list a)
  : list a
  = match l1 with
  | [] -> l2
  | hd :: tl -> hd :: app tl l2
```

Can you prove the following lemma?

```
val app_length (#a:Type) (l1 l2:list a)
: Lemma (length (app l1 l2) = length l1 + length l2)
```

Answer

# 8.4 Intrinsic vs extrinsic proofs

As the previous exercise illustrates, you can prove properties either by enriching the type of a function or by writing a separate lemma about it—we call these the 'intrinsic' and 'extrinsic' styles, respectively. Which style to prefer is a matter of taste and convenience: generally useful properties are often good candidates for intrinsic specification (e.g, that length returns a nat); more specific properties are better stated and proven as lemmas. However, in some cases, as in the following example, it may be impossible to prove a property of a function directly in its type—you must resort to a lemma.

```
let rec reverse #a (1:list a)
   : list a
   = match 1 with
   | [] -> []
   | hd :: tl -> append (reverse tl) [hd]
```

Let's try proving that reversing a list twice is the identity function. It's possible to *specify* this property in the type of reverse using a refinement type.

```
val reverse (#a:Type) : f:(list a -> list a){forall 1. 1 == f (f 1)}
```

**Note:** A subtle point: the refinement on reverse above uses a *propositional equality*. That's because equality on lists of arbitrary types is not decidable, e.g., consider list (int -> int). All the proofs below will rely on propositional equality.

However, F\* refuses to accept this as a valid type for reverse: proving this property requires two separate inductions, neither of which F\* can perform automatically.

Instead, one can use two lemmas to prove the property we care about. Here it is:

```
// (2) [reverse (append (reverse tl) [hd]) == h :: reverse (reverse tl)]
snoc_cons (reverse tl) hd

// These two facts are enough for Z3 to prove the lemma:

// reverse (reverse (hd :: tl))

// =def= reverse (append (reverse tl) [hd])

// =(2)= hd :: reverse (reverse tl)

// =(1)= hd :: tl

// =def= l
```

In the hd :: tl case of rev\_involutive we are explicitly applying not just the induction hypothesis but also the snoc\_cons auxiliary lemma also proven there.

## 8.4.1 Exercises: Reverse is injective

Click here for the exercise file.

Prove that reverse is injective, i.e., prove the following lemma.

#### Answer

```
let rec snoc_injective (#a:Type) (11:list a) (h1:a) (12:list a) (h2:a)
  : Lemma (requires snoc l1 h1 == snoc l2 h2)
          (ensures 11 == 12 / h1 == h2)
  = match 11, 12 with
    | _ :: tl1, _ :: tl2 -> snoc_injective tl1 h1 tl2 h2
    | _ -> ()
let rec rev_injective 11 12 =
 match 11,12 with
  | h1::t1, h2::t2 ->
      // assert(reverse (h1::t1) = reverse (h2::t2));
      // assert(snoc (reverse t1) h1 = snoc (reverse t2) h2);
      snoc_injective (reverse t1) h1 (reverse t2) h2;
     // assert(reverse t1 = reverse t2 /\ h1 = h2);
     rev_injective t1 t2
     // \ assert(t1 = t2 / h1::t1 = h2::t2)
  | _, _ -> ()
```

That's quite a tedious proof, isn't it. Here's a simpler proof.

The rev\_injective\_alt proof is based on the idea that every invertible function is injective. We've already proven that reverse is involutive, i.e., it is its own inverse. So, we invoke our lemma, once for 11 and once for 12. This gives

to the SMT solver the information that reverse (reverse 11) = 11 and reverse (reverse 12) = 12, which suffices to complete the proof. As usual, when structuring proofs, lemmas are your friends!

## 8.4.2 Exercise: Optimizing reverse

Earlier, we saw how to implement a tail-recursive variant of reverse.

```
let rec rev_aux #a (l1 l2:list a)
   : Tot (list a) (decreases l2)
   = match l2 with
   | []    -> l1
   | hd :: tl -> rev_aux (hd :: l1) tl

let rev #a (l:list a) : list a = rev_aux [] l
```

Prove the following lemma to show that it is equivalent to the previous non-tail-recursive implementation, i.e.,

```
val rev_is_ok (#a:_) (1:list a) : Lemma (rev [] 1 == reverse 1)
```

#### **Answer**

## 8.4.3 Exercise: Optimizing Fibonacci

Earlier, we saw how to implement a tail-recursive variant of fibonacci—we show it again below.

Prove the following lemma to show that it is equivalent to the non-tail-recursive implementation, i.e.,

```
val fib_tail_is_ok (n:nat)
: Lemma (fib_tail n == fibonacci n)
```

Answer

# 8.5 Higher-order functions

Functions are first-class values—they can be passed to other functions and returned as results. We've already seen some examples in the section on *polymorphism*. Here are some more, starting with the map function on lists.

```
let rec map #a #b (f: a -> b) (l:list a)
  : list b
  = match l with
  | [] -> []
   | hd::tl -> f hd :: map f tl
```

It takes a function f and a list 1 and it applies f to each element in 1 producing a new list. More precisely map f [v1; ...; vn] produces the list [f v1; ...; f vn]. For example:

```
 \boxed{ \text{map (fun x -> x + 1) [0; 1; 2] = [1; 2; 3] }
```

## 8.5.1 Exercise: Finding a list element

Here's a function called find that given a boolean function f and a list 1 returns the first element in 1 for which f holds. If no element is found find returns None.

```
let rec find f l =
  match l with
  | [] -> None
  | hd :: tl -> if f hd then Some hd else find f tl
```

Prove that if find returns Some x then f x = true. Is it better to do this intrinsically or extrinsically? Do it both ways.

#### **Answer**

```
val find (#a:Type) (f: a -> bool) (1:list a)
    : o:option a{ Some? o ==> f (Some?.v o)}
```

```
let rec find_alt f l =
   match l with
   | [] -> None
   | hd :: tl -> if f hd then Some hd else find_alt f tl

let rec find_alt_ok #a (f:a -> bool) (l:list a)
   : Lemma (match find_alt f l with
```

```
| Some x -> f x
| _ -> true)
= match l with
| [] -> ()
| _ :: tl -> find_alt_ok f tl
```

# 8.5.2 Exercise: fold\_left

Here is a function fold\_left, where:

```
fold_left f [b1; ...; bn] a = f (bn, ... (f b2 (f b1 a)))
```

```
let rec fold_left #a #b (f: b -> a -> a) (l: list b) (acc:a)
   : a
   = match l with
   | [] -> acc
   | hd :: tl -> fold_left f tl (f hd acc)
```

Prove the following lemma:

```
val fold_left_Cons_is_rev (#a:Type) (1:list a)
    : Lemma (fold_left Cons l [] == reverse l)
```

#### Hint: This proof is a level harder from what we've done so far.

You will need to strengthen the induction hypothesis, and possibly to prove that append is associative and that append 1 [] == 1.

#### Answer

```
let rec append_assoc #a (11 12 13 : list a)
  : Lemma (append 11 (append 12 13) == append (append 11 12) 13)
 = match 11 with
    | [] -> ()
    | h1 :: t1 -> append_assoc t1 12 13
let rec fold_left_Cons_is_rev_stronger #a (11 12: list a)
  : Lemma (fold_left Cons 11 12 == append (reverse 11) 12)
  = match 11 with
    | [] -> ()
    | h1 :: t1 ->
      // (1) [append (append (reverse t1) [h1]) 12
             == append (reverse t1) (append [h1] 12)]
      append_assoc (reverse t1) [h1] 12;
      // (2) [fold_left Cons t1 (h1 :: 12) = append (reverse t1) (h1 :: 12)]
     fold_left_Cons_is_rev_stronger t1 (h1 :: l2)
      // append (reverse 11) 12
     // =def= append (append (reverse t1) [h1]) 12
     // =(1)= append (reverse t1) (append [h1] 12)
     // =def= append (reverse t1) (h1 :: 12)
      // =(2)= fold_left Cons t1 (h1 :: 12)
      // =def= fold_left Cons 11 12
```

## CASE STUDY: QUICKSORT

We'll now put together what we've learned about defining recursive functions and proving lemmas about them to prove the correctness of Quicksort, a classic sorting algorithm.

We'll start with lists of integers and describe some properties that we'd like to hold true of a sorting algorithm, starting with a function sorted, which decides when a list of integers is sorted in increasing order, and mem, which decides if a given element is in a list. Notice that mem uses an eqtype, the type of types that support decidable equality.

```
let rec sorted (l:list int)
    : bool
    = match l with
    | [] -> true
    | [x] -> true
    | x :: y :: xs -> x <= y && sorted (y :: xs)

let rec mem (#a:eqtype) (i:a) (l:list a)
    : bool
    = match l with
    | [] -> false
    | hd :: tl -> hd = i || mem i tl
```

Given a sorting algorithm sort, we would like to prove the following property, meaning that for all input list 1, the resulting list sort 1 is sorted and has all the elements that 1 does.

```
forall 1. sorted (sort 1) /\ (forall i. mem i 1 <==> mem i (sort 1))
```

This specification is intentionally a bit weak, e.g., in case there are multiple identical elements in 1, this specification does not prevent sort from retaining only one of them.

We will see how to improve this specification below, as part of an exercise.

If you're unfamiliar with the algorithm, you can read more about it here. We'll describe several slightly different implementations and proofs of Quicksort in detail—you may find it useful to follow along interactively with the entire code development of this sequence.

# 9.1 Implementing sort

Our implementation of Quicksort is pretty simple-minded. It always picks the first element of the list as the pivot; partitions the rest of the list into those elements greater than or equal to the pivot, and the rest; recursively sorts the partitions; and slots the pivot in the middle before returning. Here it is:

```
let rec sort (l:list int)
  : Tot (list int) (decreases (length l))
  = match l with
  | [] -> []
  | pivot :: tl ->
    let hi, lo = partition ((<=) pivot) tl in
    append (sort lo) (pivot :: sort hi)</pre>
```

There are a few points worth discussing in detail:

- 1. The notation ((<=) pivot) may require some explanation: it is the *partial application* of the <= operator to just one argument, pivot. It is equivalent to fun x -> pivot <= x.
- 2. We have to prove that sort terminates. The measure we've provided is length 1, meaning that at each recursive call, we're claiming that the length of input list is strictly decreasing.
- 3. Why is this true? Well, informally, the recursive calls sort lo and sort hi are partitions of the tl of the list, which is strictly shorter than l, since we've removed the pivot element. We'll have to convince F\* of this fact by giving partition an interesting type that we'll see below.

# 9.2 Implementing partition

Here's an implementation of partition. It's a *higher-order function*, where partition f 1 returns a pair of lists  $l_1$  and  $l_2$ , a partitioning of the elements in 1 such that the every element in  $l_1$  satisfies f and the elements in  $l_2$  do not.

```
let rec partition (#a:Type) (f:a -> bool) (1:list a)
   : x:(list a & list a) { length (fst x) + length (snd x) = length 1 }
   = match l with
   | [] -> [], []
   | hd::tl ->
     let 11, 12 = partition f tl in
     if f hd
     then hd::11, 12
     else 11, hd::12
```

The specification we've given partition is only partial—we do not say, for instance, that all the elements in  $l_1$  satisfy f. We only say that the sum of the lengths of the  $l_1$  and  $l_2$  are equal to the length of l. That's because that's the only property we need (so far) about partition—this property about the lengths is what we need to prove that on the recursive calls sort l0 and sort l1, the arguments l2 and l3 and l4 are strictly shorter than the input list.

This style of partial specification should give you a sense of the art of program proof and the design choices between *intrinsic and extrinsic proof*. One tends to specify only what one needs, rather than specifying all properties one can imagine right up front.

# 9.3 Proving sort correct

Now that we have our definition of sort, we still have to prove it correct. Here's a proof—it requires three auxiliary lemmas and we'll discuss it in detail.

Our first lemma relates partition to mem: it proves what we left out in the intrinsic specification of partition, i.e., that all the elements in  $l_1$  satisfy f, the elements in  $l_2$  do not, and every element in l appears in either  $l_1$  or  $l_2$ .

Our next lemma is very specific to Quicksort. If  $l_1$  and  $l_2$  are already sorted, and partitioned by pivot, then slotting pivot in the middle of  $l_1$  and  $l_2$  produces a sorted list. The specification of sorted\_concat uses a mixture of refinement types (e.g.,  $l_1:list int{sorted l1})$  and requires / ensures specifications—this is just a matter of taste.

Our third lemma is a simple property about append and mem.

Finally, we can put the pieces together for our top-level statement about the correctness of sort.

```
let hi, lo = partition ((<=) pivot) tl in
sort_correct hi;
sort_correct lo;
partition_mem ((<=) pivot) tl;
sorted_concat (sort lo) (sort hi) pivot;
append_mem (sort lo) (pivot :: sort hi)</pre>
```

The structure of the lemma is mirrors the structure of sort itself.

- In the base case, the proof is automatic.
- In the inductive case, we partition the tail of the list and recursively call the lemma on the hi and lo components, just like sort itself. The intrinsic type of partition is also helpful here, using the length measure on the list to prove that the induction here is well-founded.
  - To prove the **ensures** postcondition, we apply our three auxiliary lemmas.
    - \* partition\_mem ((<=) pivot) tl gives us the precondition of needed to satisfy the requires clause of sorted\_concat.
    - \* We also need to prove the sorted refinements on sort lo and sort hi in order to call sorted\_concat, but the recursive calls of the lemma give us those properties.
    - \* After calling sorted\_concat, we have proven that the resulting list is sorted. What's left is to prove that all the elements of the input list are in the result, and append\_mem does that, using the postcondition of partition\_mem and the induction hypothesis to relate the elements of append (sort lo) (pivot :: sort hi) to the input list 1.

Here's another version of the sort\_correct lemma, this time annotated with lots of intermediate assertions.

```
let sort_ok (1:list int) =
    let m = sort l in
    sorted m /\
    (forall i. mem i l = mem i m)
let rec sort_correct_annotated (1:list int)
  : Lemma (ensures sort_ok 1)
          (decreases (length 1))
  = match 1 with
    | [] -> ()
    | pivot :: tl ->
      let hi, lo = partition ((<=) pivot) tl in</pre>
      assert (length hi + length lo == length tl);
      sort_correct_annotated hi;
      assert (sort_ok hi);
      sort_correct_annotated lo;
      assert (sort_ok lo);
      partition_mem ((<=) pivot) tl;</pre>
      assert (forall i. mem i tl = mem i hi || mem i lo);
      assert (forall i. mem i hi ==> pivot <= i);</pre>
      assert (forall i. mem i lo ==> i < pivot);</pre>
      assert (sort 1 == (append (sort lo) (pivot :: sort hi)));
      sorted_concat (sort lo) (sort hi) pivot;
      assert (sorted (sort 1));
      append_mem (sort lo) (pivot :: sort hi);
      assert (forall i. mem i l = mem i (sort l))
```

This is an extreme example, annotating with assertions at almost every step of the proof. However, it is indicative of a style that one often uses to interact with  $F^*$  when doing SMT-assisted proofs. At each point in your program or proof, you can use assert to check what the prover "knows" at that point. See what happens if you move the assertions around, e.g., if you move assert (sort\_ok lo) before calling sort\_correct\_annotated lo,  $F^*$  will complain that it is not provable.

# 9.4 Limitations of SMT-based proofs at higher order

You may be wondering why we used (<=) pivot instead of fun x -> pivot <= x in our code. Arguably, the latter is more readable, particularly to those not already familiar with functional programming languages. Well, the answer is quite technical.

We could indeed have written sort like this,

```
let rec sort_alt (l:list int)
  : Tot (list int) (decreases (length l))
  = match l with
    | [] -> []
    | pivot :: tl ->
        let hi, lo = partition (fun x -> pivot <= x) tl in
        append (sort_alt lo) (pivot :: sort_alt hi)</pre>
```

And we could have tried to write our main lemma this way:

```
let sort_alt_ok (1:list int) =
    let m = sort_alt l in
    sorted m /\
    (forall i. mem i l = mem i m)
let rec sort_alt_correct_annotated (1:list int)
  : Lemma (ensures sort_alt_ok 1)
          (decreases (length 1))
  = match 1 with
    | [] -> ()
    | pivot :: tl ->
      let hi, lo = partition (fun x -> pivot <= x) tl in</pre>
      assert (length hi + length lo == length tl);
      sort_alt_correct_annotated hi;
      assert (sort_alt_ok hi);
      sort_alt_correct_annotated lo;
      assert (sort_alt_ok lo);
      partition_mem (fun x -> pivot <= x) tl;</pre>
      assert (forall i. mem i tl = mem i hi || mem i lo);
      assert (forall i. mem i hi ==> pivot <= i);</pre>
      assert (forall i. mem i lo ==> i < pivot);</pre>
      //THIS NEXT LINE IS NOT PROVABLE BY SMT ALONE
      assume (sort_alt l == append (sort_alt lo) (pivot :: sort_alt hi));
      sorted_concat (sort_alt lo) (sort_alt hi) pivot;
      assert (sorted (sort_alt 1));
      append_mem (sort_alt lo) (pivot :: sort_alt hi);
      assert (forall i. mem i l = mem i (sort_alt l))
```

However, without further assistance, F\*+SMT is unable to prove the line at which the assume appears. It turns out,

this is due to a fundamental limitation in how  $F^*$  encodes its higher-order logic into the SMT solver's first-order logic. This encoding comes with some loss in precision, particularly for lambda terms. In this case, the SMT solver is unable to prove that the occurrence of fun  $x \rightarrow pivot \ll x$  that appears in the proof of sort\_alt\_correct\_annotated is identical to the occurrence of the same lambda term in sort\_alt, and so it cannot conclude that sort\_alt 1 is really equal to append (sort\_alt lo) (pivot :: sort\_alt hi)).

This is unfortunate and can lead to some nasty surprises when trying to do proofs about higher order terms. Here are some ways to avoid such pitfalls:

- Try to use named functions at higher order, rather than lambda literals. Named functions do not suffer a loss in precision when encoded to SMT. This is the reason why (<=) pivot worked out better than the lambda term here—the (<=) is a name that syntactically appears in both the definition of sort and the proof of sort\_alt\_correct and the SMT solver can easily see that the two occurrences are identical.
- If you must use lambda terms, sometimes an intrinsic proof style can help, as we'll see below.
- If you must use lambda terms with extrinsic proofs, you can still complete your proof, but you will have to help F\* along with tactics or proofs by normalization, more advanced topics that we'll cover in later sections.
- Even more forward looking, recent higher-order variants of SMT solvers are promising and may help address some of these limitations.

# 9.5 An intrinsic proof of sort

As we observed earlier, our proof of sort\_correct had essentially the same structure as the definition of sort itself—it's tempting to fuse the definition of sort with sort\_correct, so that we avoid the duplication and get a proof of correctness of sort built-in to its definition.

So, here it is, a more compact proof of sort, this time done intrinsically, i.e., by enriching the type of sort to capture the properties we want.

We still use the same three auxiliary lemmas to prove the properties we want, but this time the recursive calls to sort the partitioned sub-lists also serve as calls to the induction hypothesis for the correctness property we're after.

Notice also that in this style, the use of a lambda literal isn't problematic—when operating within the same scope,  $F^*$ 's encoding to SMT is sufficiently smart to treat the multiple occurrences of fun  $x \rightarrow pivot \ll x$  as identical functions.

## 9.5.1 Runtime cost?

You may be concerned that we have just polluted the definition of sort\_intrinsic with calls to three additional recursive functions—will this introduce any runtime overhead when executing sort\_intrinsic? Thankfully, the answer to that is "no".

As we'll learn in the section on *effects*, F\* supports of notion of *erasure*—terms that can be proven to not contribute to the observable behavior of a computation will be erased by the compiler before execution. In this case, the three lemma invocations are total functions returning unit, i.e., these are functions that always return in a finite amount of time with the constant value (), with no other observable side effect. So, there is no point in keeping those function calls around—we may as well just optimize them away to their result ().

Indeed, if you ask F\* to extract the program to OCaml (using fstar --codegen OCaml), here's what you get:

The calls to the lemmas have disappeared.

## 9.6 Exercises

## 9.6.1 Generic sorting

Here's a file with the scaffolding for this exercise.

The point of this exercise is to define a generic version of sort that is parameterized by any total order over the list elements, rather than specializing sort to work on integer lists only. Of course, we want to prove our implementations correct. So, let's do it in two ways, both intrinsically and extrinsically. Your goal is to remove the all the occurrences of admit in the development below.

```
module Part1.Quicksort.Generic

//Some auxiliary definitions to make this a standalone example
let rec length #a (l:list a)
   : nat
   = match l with
   | [] -> 0
   | _ :: tl -> 1 + length tl

let rec append #a (l1 l2:list a)
   : list a
   = match l1 with
   | [] -> 12
   | hd :: tl -> hd :: append tl l2

let total_order (#a:Type) (f: (a -> a -> bool)) =
```

(continues on next page)

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```
(forall a. f a a)
                                                          (* reflexivity
                                                                         *)
   /\ (forall a1 a2 a3. f a1 a2 /\ f a2 a3 ==> f a1 a3)
                                                          (* transitivity *)
                                                           (* totality *)
   /\ (forall a1 a2. f a1 a2 \/ f a2 a1)
let total_order_t (a:Type) = f:(a -> a -> bool) { total_order f }
let rec sorted #a (f:total_order_t a) (1:list a)
 : bool
 = match 1 with
   | [] -> true
   | [x] -> true
   | x :: y :: xs -> f x y && sorted f (y :: xs)
let rec mem (#a:eqtype) (i:a) (1:list a)
 : bool
 = match 1 with
   | [] -> false
   | hd :: tl -> hd = i || mem i tl
let rec sort #a (f:total_order_t a) (1:list a)
 : Tot (list a) (decreases (length 1))
 = admit()
let rec sort_correct (#a:eqtype) (f:total_order_t a) (1:list a)
 : Lemma (ensures (
          let m = sort f l in
          sorted f m /\
          (forall i. mem i l = mem i m)))
         (decreases (length 1))
 = admit()
let rec sort_intrinsic (#a:eqtype) (f:total_order_t a) (1:list a)
 : Tot (m:list a {
               sorted f m /\
               (forall i. mem i l = mem i m)
        })
  (decreases (length 1))
 = admit()
```

#### Answer

```
module Part1.Quicksort.Generic

//Some auxiliary definitions to make this a standalone example
let rec length #a (1:list a)
   : nat
   = match 1 with
   | [] -> 0
   | _ :: tl -> 1 + length tl

let rec append #a (11 12:list a)
```

```
: list a
  = match 11 with
   | [] -> 12
    | hd :: tl -> hd :: append tl 12
let total_order (#a:Type) (f: (a -> a -> bool)) =
    (forall a. f a a)
                                                               (* reflexivity *)
   /\ (forall a1 a2. (f a1 a2 /\ a1=!=a2) <==> not (f a2 a1)) (* anti-symmetry *)
   /\ (forall a1 a2 a3. f a1 a2 /\ f a2 a3 ==> f a1 a3)
                                                                (* transitivity *)
                                                                 (* totality *)
   /\ (forall a1 a2. f a1 a2 \/ f a2 a1)
let total_order_t (a:Type) = f:(a -> a -> bool) { total_order f }
let rec sorted #a (f:total_order_t a) (1:list a)
 : bool
 = match 1 with
   | [] -> true
   | [x] -> true
   | x :: y :: xs -> f x y && sorted f (y :: xs)
let rec mem (#a:eqtype) (i:a) (l:list a)
  : bool
 = match 1 with
   | [] -> false
    | hd :: tl -> hd = i || mem i tl
let rec partition (#a:Type) (f:a -> bool) (1:list a)
  : x:(list a & list a) { length (fst x) + length (snd x) = length 1 }
  = match 1 with
    | [] -> [], []
    | hd::tl ->
     let 11, 12 = partition f tl in
      if f hd
      then hd::11, 12
      else 11, hd::12
let rec sort #a (f:total_order_t a) (1:list a)
 : Tot (list a) (decreases (length 1))
 = match 1 with
   | [] -> []
    | pivot :: tl ->
     let hi, lo = partition (f pivot) tl in
      append (sort f lo) (pivot :: sort f hi)
let rec partition_mem (#a:eqtype)
                      (f:(a -> bool))
                      (l:list a)
  : Lemma (let 11, 12 = partition f 1 in
           (forall x. mem x 11 \Longrightarrow f x) /\
           (forall x. mem x 12 ==> not (f x)) /
           (forall x. mem x 1 = (mem x 11 || mem x 12)))
```

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9.6. Exercises 79

```
= match 1 with
   | [] -> ()
    | hd :: tl -> partition_mem f tl
let rec sorted_concat (#a:eqtype)
                      (f:total_order_t a)
                      (l1:list a{sorted f l1})
                      (12:list a{sorted f 12})
                      (pivot:a)
  : Lemma (requires (forall y. mem y 11 ==> not (f pivot y)) /\
                    (forall y. mem y 12 ==> f pivot y))
          (ensures sorted f (append 11 (pivot :: 12)))
  = match 11 with
    | [] -> ()
    | hd :: tl -> sorted_concat f tl 12 pivot
let rec append_mem (#t:eqtype)
                   (l1 l2:list t)
  : Lemma (ensures (forall a. mem a (append 11 12) = (mem a 11 || mem a 12)))
 = match 11 with
    | [] -> ()
    | hd::tl -> append_mem tl 12
let rec sort_correct (#a:eqtype) (f:total_order_t a) (1:list a)
  : Lemma (ensures (
           let m = sort f l in
           sorted f m /\
           (forall i. mem i l = mem i m)))
          (decreases (length 1))
  = match 1 with
   | [] -> ()
    | pivot :: tl ->
      let hi, lo = partition (f pivot) tl in
      sort_correct f hi;
      sort_correct f lo;
      partition_mem (f pivot) tl;
      sorted_concat f (sort f lo) (sort f hi) pivot;
      append_mem (sort f lo) (pivot :: sort f hi)
let rec sort_intrinsic (#a:eqtype) (f:total_order_t a) (1:list a)
  : Tot (m:list a {
                sorted f m /\
                (forall i. mem i l = mem i m)
         })
   (decreases (length 1))
  = match 1 with
    | [] -> []
    | pivot :: tl ->
      let hi, lo = partition (f pivot) tl in
      partition_mem (f pivot) tl;
      sorted_concat f (sort_intrinsic f lo) (sort_intrinsic f hi) pivot;
      append_mem (sort_intrinsic f lo) (pivot :: sort_intrinsic f hi);
```

```
append (sort_intrinsic f lo) (pivot :: sort_intrinsic f hi)
```

# 9.6.2 Proving that sort is a permutation

We promised at the beginning of this section that we'd eventually give a better specification for sort, one that proves that it doesn't drop duplicate elements in the list. That's the goal of the exercise in this section—we'll prove that our generic Quicksort is returns a permutation of the input list.

Let's start by defining what it means for lists to be permutations of each other—we'll do this using occurrence counts.

The definitions should be self-explanatory. We include one key lemma append\_count to relate occurrence to list concatenations.

The next key lemma to prove is partition\_mem\_permutation.

You will also need a lemma similar to the following:

Using these, and adaptations of our previous lemmas, prove:

9.6. Exercises 81

Load the exercise script and give it a try.

#### Answer

```
module Part1.Quicksort.Permutation
#push-options "--fuel 1 --ifuel 1"
//Some auxiliary definitions to make this a standalone example
let rec length #a (1:list a)
 : nat
 = match 1 with
   | [] -> 0
    \mid _ :: tl -> 1 + length tl
let rec append #a (l1 l2:list a)
  : list a
 = match 11 with
   | [] -> 12
    | hd :: tl -> hd :: append tl 12
let total_order (#a:Type) (f: (a -> a -> bool)) =
    (forall a. f a a)
                                                            (* reflexivity *)
   /\ (forall a1 a2. (f a1 a2 /\ a1=!=a2) \iff not (f a2 a1)) (* anti-symmetry *)
   (* transitivity *)
   /\ (forall a1 a2. f a1 a2 \/ f a2 a1)
                                                             (* totality *)
let total_order_t (a:Type) = f:(a -> a -> bool) { total_order f }
let rec sorted #a (f:total_order_t a) (1:list a)
 : bool
 = match 1 with
   | [] -> true
    | [x] -> true
   | x :: y :: xs -> f x y && sorted f (y :: xs)
//SNIPPET_START: count permutation
let rec count (#a:eqtype) (x:a) (1:list a)
 : nat
 = match 1 with
    | hd::tl -> (if hd = x then 1 else 0) + count x tl
    | [] -> 0
let mem (#a:eqtype) (i:a) (1:list a)
  : bool
 = count i 1 > 0
let is_permutation (#a:eqtype) (1 m:list a) =
  forall x. count x 1 = count x m
```

```
let rec append_count (#t:eqtype)
                     (l1 l2:list t)
  : Lemma (ensures (forall a. count a (append 11 12) = (count a 11 + count a 12)))
 = match 11 with
   | [] -> ()
    | hd::tl -> append_count tl 12
//SNIPPET_END: count permutation
let rec partition (#a:Type) (f:a -> bool) (1:list a)
  : x:(list a & list a) { length (fst x) + length (snd x) = length 1 }
  = match 1 with
   | [] -> [], []
    | hd::tl ->
      let 11, 12 = partition f tl in
      if f hd
      then hd::11, 12
      else 11, hd::12
let rec sort #a (f:total_order_t a) (l:list a)
  : Tot (list a) (decreases (length 1))
  = match 1 with
    | [] -> []
    | pivot :: tl ->
      let hi, lo = partition (f pivot) tl in
      append (sort f lo) (pivot :: sort f hi)
let rec partition_mem_permutation (#a:eqtype)
                                  (f:(a -> bool))
                                  (l:list a)
  : Lemma (let 11, 12 = partition f 1 in
           (forall x. mem x 11 ==> f x) / 
           (forall x. mem x 12 ==> not (f x)) /
           (is_permutation 1 (append 11 12)))
  = match 1 with
   | [] -> ()
    | hd :: tl ->
      partition_mem_permutation f tl;
      let hi, lo = partition f tl in
      append_count hi lo;
      append_count hi (hd::lo);
      append_count (hd :: hi) lo
let rec sorted_concat (#a:eqtype)
                      (f:total_order_t a)
                      (l1:list a{sorted f l1})
                      (12:list a{sorted f 12})
                      (pivot:a)
  : Lemma (requires (forall y. mem y 11 ==> not (f pivot y)) /
                    (forall y. mem y 12 ==> f pivot y))
          (ensures sorted f (append l1 (pivot :: l2)))
  = match 11 with
    | [] -> ()
```

(continues on next page)

9.6. Exercises 83

```
| hd :: tl -> sorted_concat f tl 12 pivot
let permutation_app_lemma (#a:eqtype) (hd:a) (tl:list a)
                          (l1:list a) (l2:list a)
   : Lemma (requires (is_permutation tl (append 11 12)))
           (ensures (is_permutation (hd::tl) (append 11 (hd::l2))))
  = append_count 11 12;
    append_count 11 (hd :: 12)
let rec sort_correct (#a:eqtype) (f:total_order_t a) (1:list a)
  : Lemma (ensures (
           sorted f (sort f 1) /\
           is_permutation 1 (sort f 1)))
          (decreases (length 1))
  = match 1 with
   | [] -> ()
    | pivot :: tl ->
      let hi, lo = partition (f pivot) tl in
      partition_mem_permutation (f pivot) tl;
      append_count lo hi;
      append_count hi lo;
      assert (is_permutation tl (append lo hi));
      sort_correct f hi;
      sort_correct f lo;
      sorted_concat f (sort f lo) (sort f hi) pivot;
      append_count (sort f lo) (sort f hi);
      assert (is_permutation tl (sort f lo `append` sort f hi));
      permutation_app_lemma pivot tl (sort f lo) (sort f hi)
let rec sort_intrinsic (#a:eqtype) (f:total_order_t a) (l:list a)
  : Tot (m:list a {
                sorted f m /\
                is_permutation 1 m
         })
   (decreases (length 1))
  = match 1 with
   | [] -> []
    | pivot :: tl ->
      let hi, lo = partition (f pivot) tl in
     partition_mem_permutation (f pivot) tl;
      append_count lo hi; append_count hi lo;
      sorted_concat f (sort_intrinsic f lo) (sort_intrinsic f hi) pivot;
      append_count (sort_intrinsic f lo) (sort_intrinsic f hi);
     permutation_app_lemma pivot tl (sort_intrinsic f lo) (sort_intrinsic f hi);
      append (sort_intrinsic f lo) (pivot :: sort_intrinsic f hi)
```

**CHAPTER** 

**TEN** 

## **EXECUTING PROGRAMS**

We've been through several chapters already, having learned many core concepts of F\*, but we have yet to see how to compile and execute a program, since our focus so far has been on F\*'s logic and how to prove properties about programs.

F\* offers several choices for executing a program, which we cover briefly here, using Quicksort as a running example.

# 10.1 Interpreting F\* programs

As mentioned in the *capsule summary*, F\* includes an engine (called the *normalizer*) that can symbolically reduce F\* computations. We'll see many more uses of F\*'s normalizer as we go, but one basic usage of it is to use it to interpret programs.

Invoking the interpreter is easy using *fstar-mode.el* in emacs. In emacs, go to the F\* menu, then to *Interactive queries*, then choose *Evaluate an expression* (or type C-c C-s C-e): this prompts you to enter an expression that you want to evaluate: type sort ( <= ) [4;3;2;1] and then press "Enter". You should see the following output: sort ( <= ) [4;3;2;1]  $\downarrow \beta \delta \iota \zeta$  [1; 2; 3; 4] <: Prims.Tot (list int), saying that the input term reduced to [1; 2; 3; 4] of type Tot (list int).

The  $\downarrow \beta \delta \iota \zeta$  may seem a bit arcane, but it describes the reduction strategy that F\* used to interpret the term:

- $\beta$  means that functions were applied
- $\delta$  means that definitions were unfolded
- $\iota$  means that patterns were matched
- $\zeta$  means that recursive functions were unrolled

We'll revisit what these reduction steps mean in a later chapter, including how to customize them for your needs.

# 10.2 Compiling to OCaml

The main way to execute F\* programs is by compiling, or *extracting*, them to OCaml and then using OCaml's build system and runtime to produce an executable and run it.

**Note:** The method that we show here works for simple projects with just a few files. For larger projects, F\* offers a dependence analysis that can produce dependences for use in a Makefile. F\* also offers separate compilation which allows a project to be checked one file at a time, and for the results to be cached and reused. For documentation and examples of how to use these features and structure the build for larger projects see these resources:

• Dealing with dependences

- Caching verified modules
- A multifile project

# 10.2.1 Producing an OCaml library

To extract OCaml code from a F\* program use the command-line options, as shown below:

```
fstar --codegen OCaml --extract Part1.Quicksort --odir out Part1.Quicksort.Generic.fst
```

- The --codegen option tells F\* to produce OCaml code
- The --extract option tells  $F^*$  to only extract all modules in the given namespace, i.e., in this case, all modules in Part1.Quicksort
- The --odir option tells F\* to put all the generated files into the specified directory; in this case out
- The last argument is the source file to be checked and extracted

The resulting OCaml code is in the file Part1\_Quicksort\_Generic.ml, where the F\* dot-separated name is transformed to OCaml's naming convention for modules. The generated code is here

Some points to note about the extracted code:

- F\* extracts only those definitions that correspond to executable code. Lemmas and other proof-only aspects are erased. We'll learn more about erasure in a later chapter.
- The F\* types are translated to OCaml types. Since F\* types are more precise than OCaml types, this translation process necessarily involves a loss in precision. For example, the type of total orders in Part1.Quicksort. Generic.fst is:

```
let total_order_t (a:Type) = f:(a -> a -> bool) { total_order f }
```

Whereas in OCaml it becomes

```
type 'a total_order_t = 'a -> 'a -> Prims.bool
```

This means that you need to be careful when calling your extracted F\* program from unverified OCaml code, since the OCaml compiler will not complain if you pass in some function that is not a total order where the F\* code expects a total order.

# 10.2.2 Compiling an OCaml library

Our extracted code provides several top-level functions (e.g., sort) but not main. So, we can only compile it as a library.

For simple uses, one can compile the generated code into a OCaml native code library (a cmxa file) with ocamlbuild, as shown below

```
OCAMLPATH=$FSTAR_HOME/lib ocamlbuild -use-ocamlfind -pkg batteries -pkg fstar.lib Part1_ Quicksort_Generic.cmxa
```

Some points to note:

- You need to specify the variable OCAMLPATH which OCaml uses to find required libraries. For F\* projects, the OCAMLPATH should include the bin directory of the FStar release bundle.
- The -use-ocamlfind option enables a utility to find OCaml libraries.

- Extracted F\* programs rely on two libraries: batteries and fstar.lib, which is what the -pkg options say.
- Finally, Part1\_Quicksort\_Generic.cmxa references the name of the corresponding .ml file, but with the .cmxa extension to indicate that we want to compile it as a library.

Your can use the resulting .cmxa file in your other OCaml projects.

# 10.2.3 Adding a 'main'

We have focused so far on programming and proving *total* functions. Total functions have no side effects, e.g., they cannot read or write state, they cannot print output etc. This makes total functions suitable for use in libraries, but to write a top-level driver program that can print some output (i.e., a main), we need to write functions that actually have some effects.

We'll learn a lot more about F\*'s support for effectful program in a later section, but for now we'll just provide a glimpse of it by showing (below) a main program that calls into our Quicksort library.

```
module Part1.Ouicksort.Main
module 0 = Part1.Ouicksort.Generic
//Printing the elements of an integer list, using the FStar.Printf library
let string_of_int_list 1 =
  Printf.sprintf "[%s]"
    (String.concat "; " (List.Tot.map (Printf.sprintf "%d") 1))
//A main program, which sorts a list and prints it before and after
let main () =
  let orig = [42; 17; 256; 94] in
  let sorted = Q.sort ( <= ) orig in</pre>
   Printf.sprintf "Original list = %s\nSorted list = %s\n"
      (string_of_int_list orig)
      (string_of_int_list sorted)
  in
  FStar.IO.print_string msg
//Run ``main ()`` when the module loads
#push-options "--warn_error -272"
let _ = main ()
#pop-options
```

There are few things to note here:

- This time, rather than calling Q.sort from unverified OCaml code, we are calling it from  $F^*$ , which requires us to prove all its preconditions, e.g., that the comparison function ( <= ) that we are passing in really is a total order— $F^*$  does that automatically.
- FStar.IO.print\_string is a library function that prints a string to stdout. Its type is string -> ML unit, a type that we'll look at in detail when we learn more about effects. For now, keep in mind that functions with the ML label in their type may have observable side effects, like IO, raising exceptions, etc.
- The end of the file contains let \_ = main (), a top-level term that has a side-effect (printing to stdout) when executed. In a scenario where we have multiple modules, the runtime behavior of a program with such top-level side-effects depends on the order in which modules are loaded. When F\* detects this, it raises the warning 272. In this case, we intend for this program to have a top-level effect, so we suppress the warning using the --warn\_error -272 option.

To compile this code to OCaml, along with its dependence on Part1.Quicksort.Generic, one can invoke:

```
fstar --codegen OCaml --extract Part1.Quicksort --odir out Part1.Quicksort.Main.fst
```

This time, F\* extracts both Part1.Quicksort.Generic.fst (as before) and Part1.Quicksort.Main.fst to OCaml, producing Part1\_Quicksort\_Main.ml to OCaml.

You can compile this code in OCaml to a native executable by doing:

```
OCAMLPATH=$FSTAR_HOME/lib ocamlbuild -use-ocamlfind -pkg batteries -pkg fstar.lib Part1_ —Quicksort_Main.native
```

And, finally, you can execute Part1\_Quicksort\_Main.native to see the following output:

```
$ ./Part1_Quicksort_Main.native
Original list = [42; 17; 256; 94]
Sorted list = [17; 42; 94; 256]
```

# 10.3 Compiling to other languages

 $F^*$  also supports compiling programs to  $F^*$  and, for a subset of the language, supports compilation to C.

For the F# extraction, use the --codegen FSharp option. However, it is more typical to structure an F\* project for use with F# using Visual Studio project and solution files. Here are some examples:

- A simple example
- A more advanced example mixing F\* and F# code

For extraction to C, please see the tutorial on Low\*.

**CHAPTER** 

# **ELEVEN**

## WRAPPING UP

Congratulations! You've reached the end of an introduction to basic F\*.

You should have learned the following main concepts:

- Basic functional programming
- Using types to write precise specifications
- Writing proofs as total functions
- · Defining and working with new inductive types
- · Lemmas and proofs by induction

Throughout, we saw how  $F^*$ 's use of an SMT solver can reduce the overhead of producing proofs, and you should know enough now to be productive in small but non-trivial  $F^*$  developments.

However, it would be wrong to conclude that SMT-backed proofs in  $F^*$  are all plain sailing. And there's a lot more to  $F^*$  than SMT proofs—so read on through the rest of this book.

But, if you do plan to forge ahead with mainly SMT-backed proofs, you should keep the following in mind before attempting more challenging projects.

It'll serve you well to learn a bit more about how an SMT solver works and how  $F^*$  interfaces with it—this is covered in a few upcoming sections, including a section on *classical proofs* and in *understanding how*  $F^*$  *uses* Z3. Additionally, if you're interested in doing proofs about arithmetic, particularly nonlinear arithmetic, before diving in, you would do well to read more about the  $F^*$  library FStar.Math.Lemmas and  $F^*$  arithmetic settings.

# Part III

# Representing Data, Proofs, and Computations with Inductive Types

Earlier, we learned about *defining new data types* in F\*. For example, here's the type of lists parameterized by a type a of the list elements.

```
type list a =
   | Nil : list a
   | Cons : hd:a -> tl:list a -> list a
```

We also saw that it was easy to define basic functions over these types, using pattern matching and recursion. For example, here's a function to compute the length of a list.

```
let rec length #a (l:list a)
   : nat
   = match l with
   | [] -> 0
   | _ :: tl -> 1 + length tl
```

The function length defines some property of a list (its length) separately from the definition of the list type itself. Sometimes, however, it can be convenient to define a property of a type together with the type itself. For example, in some situations, it may be natural to define the length of the list together with the definition of the list type itself, so that every list is structurally equipped with a notion of its length. Here's how:

```
type vec (a:Type) : nat -> Type =
   | Nil : vec a 0
   | Cons : #n:nat -> hd:a -> tl:vec a n -> vec a (n + 1)
```

What we have here is our first indexed type, vec a n. One way to understand this definition is that vec a: nat -> Type describes a family of types, vec a 0, vec a 1, ... etc., all representing lists of a-typed elements, but where the *index* n describes the length of the list. With this definition of vec, the function length is redundant: given a v: vec a n we know that its length v is n, without having to recompute it.

This style of enriching a type definition with indexes to state properties of the type is reminiscent of what we learned earlier about *intrinsic versus extrinsic proofs*. Rather than defining a single type list a for all lists and then separatately (i.e., extrinsically) defining a function length to compute the length of a list, with vec we've enriched the type of the list intrinsically, so that type of vec immediately tells you its length.

Now, you may have seen examples like this length-indexed vec type before—it comes up often in tutorials about dependently typed programming. But, indexed types can do a lot more. In this section we learn about indexed inductive types from three related perspectives:

- Representing data: Inductive types allow us to build new data types, includes lists, vectors, trees, etc. in several flavors. We present two case studies: *vectors* and *Merkle trees*, a binary tree data structure equipped with cryptographic proofs.
- Representing proofs: The core logic of F\* rests upon several simple inductive type definitions. We revisit the logical connectives we've seen before (including the *propositional connectives* and *equality*) and show how rather than being primitive notions in F\*, their definitions arise from a few core constructions involving inductive type. Other core notions in the language, including the handling of *termination proofs*, can also be understood in terms of inductive types that *model well-founded recursion*.
- Representing computations: Inductive type definitions allow embedding other programming languages or computational models within F\*. We develop two case studies.
  - We develop a *deep embedding of the simply-typed lambda calculus* with several reduction strategies, and a
    proof of its syntactic type soundness. The example showcases the use of several inductive types to represent
    the syntax of a programming language, a relation describing its type system, and another relation describing
    its operational semantics.

- We also show how to use higher-order abstract syntax to represent well-typed lambda terms, a concise style
  that illustrates how to use inductive types that store functions.
- Finally, we look at a shallow embedding of an imperative programming language with structured concurrency, representing computations as infinitely branching inductively defined trees. The example introduces modeling computational effects as monads and showcases the use of inductive types at higher order.

This section is somewhat more advanced than the first. It also interleaves some technical material about F\*'s core logic with case studies showing some of those core concepts at work. You can certainly work through the material sequentially, but depending on your interests, you may find the following paths through the material to be more accessible.

If you're familiar with dependent types but are new to F\* and want a quick tour, the following path might work for you:

- Length-indexed lists, F\*-specific notations
- Equality
- Logical connectives
- Any of the case studies, depending on your interest.

If you're unfamiliar with dependent types and are more curious to learn how to use  $F^*$  by working through examples, following path might work for you:

- Inductive type definitions, basic concepts
- Length-indexed lists, F\*-specific notations in the simplest setting
- Merkle trees, a more interesting example, with applications to cryptographic security
- Logical connectives, some utilities to manipulate F\*'s logical connectives
- Any of the case studies, depending on your interest, with the Simply Typed Lambda Calculus perhaps the easiest
  of them.

But, by the end of this section, through several exercises, we expect the reader to be familiar enough with inductive types to define their own data structures and inductively defined relations, while also gaining a working knowledge of some core parts of  $F^*$ 's type theory.

**CHAPTER** 

## **TWELVE**

## INDUCTIVE TYPE DEFINITIONS

An inductive type definition, sometimes called a *datatype*, has the following general structure.

$$\operatorname{type} T_1 \ \overline{(x_1:p_1)} : \overline{y_1:q_1} \to \operatorname{Type} = \overline{|D_1:t_1|}$$
 
$$\dots$$
 and 
$$T_n \ \overline{(x_n:p_n)} : \overline{y_n:q_n} \to \operatorname{Type} = \overline{|D_n:t_n|}$$

This defines n mutually inductive types, named  $T_1 \dots T_n$ , called the *type constructors*. Each type constructor  $T_i$  has a number of *parameters*, the  $\overline{x_i : p_i}$ , and a number of *indexes*, the  $\overline{y_i : q_i}$ .

Each type constructor  $T_i$  has zero or more  $data\ constructors\ \overline{D_i:t_i}$ . For each data constructor  $D_{ij}$ , its type  $t_{ij}$  must be of the form  $\overline{z:s}\to T_i\ \bar{x_i}\ \bar{e}$ , i.e., it must be a function type returning an instance of  $T_i$  with the same parameters  $\overline{x_i}$  as in the type constructor's signature, but with any other well-typed terms  $\overline{e}$  for the index arguments. This is the main difference between a parameter and an index—a parameter of a type constructor cannot vary in the result type of the data constructors, while the indexes can.

Further, in each of the arguments  $\overline{z:s}$  of the data constructor, none of the mutually defined type constructors  $\overline{T}$  may appear to the left of an arrow. That is, all occurrences of the type constructors must be *strictly positive*. This is to ensure that the inductive definitions are well-founded, as explained below. Without this restriction, it is easy to break soundness by writing non-terminating functions with Tot types.

Also related to ensuring logical consistency is the *universe* level of an inductive type definition. We'll return to that later, once we've done a few examples.

# 12.1 Strictly positive definitions

As a strawman, consider embedding a small dynamically typed programming language within  $F^*$ . All terms in our language have the same static type dyn, although at runtime values could have type Bool, or Int, or Function.

One attempt at representing a language like this using a data type in  $F^*$  is as follows:

```
noeq
type dyn =
    | Bool : bool -> dyn
    | Int : int -> dyn
    | Function : (dyn -> dyn) -> dyn
```

The three cases of the data type represent our three kinds of runtime values: Bool b, Int b, and Function f. The Function case, however, is problematic: The argument f is itself a function from dyn -> dyn, and the constructor Function allows promoting a dyn -> dyn function into the type dyn itself, e.g., one can represent the identity function in dyn as Function (fun (x:dyn) -> x). However, the Function case is problematic: as we will see below, it allows circular definitions that enable constructing instances of dyn without actually providing any base case. F\* rejects the definition of dyn, saying "Inductive type dyn does not satisfy the strict positivity condition".

Consider again the general shape of an inductive type definition:

$$\operatorname{type} T_1 \ \overline{(x_1:p_1)}: \overline{y_1:q_1} \to \operatorname{Type} = \overline{|D_1:t_1|}$$
 
$$\dots$$
 and 
$$T_n \ \overline{(x_n:p_n)}: \overline{y_n:q_n} \to \operatorname{Type} = \overline{|D_n:t_n|}$$

This definition is strictly positive when

- for every type constructor  $T \in T_1, ..., T_n$ ,
- and every data constructor  $D: t \in \overline{D_1}, ...\overline{D_n}$ , where t is of the form  $x0: s_0 \to ... \to xn: s_n \to T_i...$ , and  $s_0, ..., s_n$  are the types of the fields of D
- and for all instantiations  $\overline{v}$  of the type parameters  $\overline{p}$  of the type T,
- T does not appear to the left of any arrow in any  $s \in (s_0, ..., s_k)[\overline{v}/\overline{p}]$ .

Our type dyn violates this condition, since the defined typed dyn appears to the left of an arrow type in the dyn -> dyn-typed field of the Function constructor.

To see what goes wrong if F\* were to accept this definition, we can suppress the error reported by using the option \_\_no\_positivity and see what happens.

```
#push-options "--__no_positivity"
noeq
type dyn =
    | Bool : bool -> dyn
    | Int : int -> dyn
    | Function : (dyn -> dyn) -> dyn
#pop-options
```

**Note:** F\* maintains an internal stack of command line options. The #push-options pragma pushes additional options at the top of the stack, while #pop-options pops the stack. The pattern used here instructs F\* to typecheck dyn only with the \_\_no\_positivity option enabled. As we will see, the \_\_no\_positivity option can be used to break soundness, so use it only if you really know what you're doing.

Now, having declared that dyn is a well-formed inductive type, despite not being strictly positive, we can break the soundness of F\*. In particular, we can write terms and claim they are total, when in fact their execution will loop forever.

```
let loop' (f:dyn)
  : dyn
  = match f with
    | Function g -> g f
    | _ -> f

let loop
  : dyn
    = loop' (Function loop')
```

Here, the type of loop claims that it is a term that always evaluates in a finite number of steps to a value of type dyn. Yet, reducing it produces an infinite chain of calls to loop' (Function loop'). Admitting a non-positive definition like dyn has allowed us to build a non-terminating loop.

Such loops can also allow one to prove False (breaking soundness), as the next example shows.

```
#push-options "--__no_positivity"
noeq
type non_positive =
    | NP : (non_positive -> False) -> non_positive
#pop-options

let almost_false (f:non_positive)
    : False
    = let NP g = f in g f

let ff
    : False
    = almost_false (NP almost_false)
```

This example is very similar to dyn, except NP stores a non-positive function that returns False, which allows use to prove ff: False, i.e., in this example, not only does the violation of strict positivity lead to an infinite loop at runtime, it also renders the entire proof system of  $F^*$  useless, since one can prove False.

Finally, in the example below, although the type  $also\_non\_pos$  does not syntactically appear to the left of an arrow in a field of the ANP constructor, an instantiation of the type parameter f (e.g., with the type  $f\_false$ ) does make it appear to the left of an arrow—so this type too is deemed not strictly positive, and can be used to prove False.

We hope you are convinced that non-strictly positive types should not be admissible in inductive type definitions. In what follows, we will no longer use the \_\_no\_positivity option. In a later section, once we've introduced the *effect* of divergence, we will see that non-positive definitions can safely be used in a context where programs are not expected to terminate, allowing one to safely model things like the dyn type, without compromising the soundness of F\*.

## 12.1.1 Strictly Positive Annotations

Sometimes it is useful to parameterize an inductive definition with a type function, without introducing a non-positive definition as we did in also\_non\_pos above.

For example, the definition below introduces a type free f a, a form of a tree whose leaf nodes contain a values, and whose internal nodes branch according the type function f.

We can instantiate this generic free to produce various kinds of trees. Note: when instantiating free list a in variable\_branching\_list below, we need to explicitly re-define the list type with a strict-positivity annotation: F\* does not correctly support rechecking type constructors to prove that they are strictly positive when they are used at higher order.

```
let binary_tree (a:Type) = free (fun t -> t & t) a
let list_redef ([@@@strictly_positive] a:Type) = list a
let variable_branching_list a = free list_redef a
let infinite_branching_tree a = free (fun t -> nat -> t) a
```

However, we should only be allowed to instantate f with type functions that are strictly positive in their argument, since otherwise we can build a proof of False, as we did with also\_non\_pos. The @@@strictly\_positive attribute on the formal parameter of f enforces this.

If we were to try to instantiate free with a non-strictly positive type function,

```
let free_bad = free (fun t -> (t -> False)) int
```

then F\* raises an error:

```
Binder (t: Type) is marked strictly positive, but its use in the definition is not
```

## 12.1.2 Unused Annotations

Sometimes one indexes a type by another type, though the index has no semantic meaning. For example, in several  $F^*$  developments that model mutable state, the a heap reference is just a natural number modeling its address in the heap. However, one might use the type let ref (a:Type) = nat to represent the type of a reference, even though the type a is not used in the definition. In such cases, it can be useful to mark the parameter as unused, to inform  $F^*$ 's positivity checker that the type index is actually irrelevant. The snippet below shows an example:

```
irreducible
let ref ([@@@unused] a:Type) = nat
noeq
type linked_list (a:Type) =
    | LL : ref (a & linked_list a) -> linked_list a
noeq
type neg_unused =
    | NU : ref (neg_unused -> bool) -> neg_unused
```

Here, we've marked the parameter of ref with the unused attribute. We've also marked ref as irreducible just to ensure for this example that  $F^*$  does not silently unfold the definition of ref.

Now, knowing that the parameter of ref is unused, one can define types like linked\_list a, where although linked\_list a appears as an argument to the ref type, the positivity checker accepts it, since the parameter is unused. This is similar to the use of a strictly\_positive annotation on a parameter.

However, with the unused attribute, one can go further: e.g., the type neg\_unused shows that even a negative occurrence of the defined type is accepted, so long as it appears only as an instantiation of an unused parameter.

**CHAPTER** 

### **THIRTEEN**

## LENGTH-INDEXED LISTS

To make concrete some aspects of the formal definitions above, we'll look at several variants of a parameterized list datatype augmented with indexes that carry information about the list's length.

# 13.1 Even and Odd-lengthed Lists

Our first example is bit artifical, but helps illustrate a usage of mutually inductive types.

Here, we're defining two types constructors called even and odd, (i.e, just  $T_1$  and  $T_2$  from our formal definition), both with a single parameter (a:Type), for the type of the lists' elements, and no indexes.

All lists of type even a have an even number of elements—zero elements, using its first constructor ENil, or using ECons, one more than the number of elements in an odd a, a list with an odd number of elements. Elements of the type odd a are constructed using the constructor OCons, which adds a single element to an even a list. The types are mutually inductive since their definitions reference each other.

```
type even (a:Type) =
  | ENil : even a
  | ECons : a -> odd a -> even a
and odd (a:Type) =
  | OCons : a -> even a -> odd a
```

Although closely related, the types even a and odd a are from distinct inductive types. So, to compute, say, the length of one of these lists one generally write a pair of mutually recursive functions, like so:

Note, we can prove that the length of an even a and odd a are really even and odd.

Now, say, you wanted to map a function over an even a, you'd have to write a pair of mutually recursive functions to map simultaneously over them both. This can get tedious quickly. Instead of rolling out several mutually inductive but distinct types, one can instead use an *indexed* type to group related types in the same inductive family of types.

The definition of even\_or\_odd\_list below shows an inductive type with one parameter a, for the type of lists elements, and a single boolean index, which indicates whether the list is even or odd. Note how the index varies in the types of the constructors, whereas the parameter stays the same in all instances.

```
type even_or_odd_list (a:Type) : bool -> Type =
   | EONil : even_or_odd_list a true
   | EOCons : a -> #b:bool -> even_or_odd_list a b -> even_or_odd_list a (not b)
```

Now, we have a single family of types for both even and odd lists, and we can write a single function that abstracts over both even and odd lists, just by abstracting over the boolean index. For example, eo\_length computes the length of an even\_or\_odd\_list, with its type showing that it returns an even number with b is true and an odd number otherwise.

```
let rec eo_length #a #b (l:even_or_odd_list a b)
    : Tot (n:nat { if b then n % 2 == 0 else n % 2 == 1})
          (decreases l)
    = match l with
          | EONil -> 0
          | EOCons _ tl -> 1 + eo_length tl
```

**Note:** Note, in eo\_length we had to explicitly specify a decreases clause to prove the function terminating. Why? Refer back to the section on *default measures* to recall that by default is the lexicographic ordering of all the arguments in order. So, without the decreases clause, F\* will try to prove that the index argument b decreases on the recursive call, which it does not.

This is our first type with with both parameters and indices. But why stop at just indexing to distinguish even and odd-lengthed lists? We can index a list by its length itself.

#### 13.2 Vectors

Let's look again at the definition of the vec type, first shown in the introduction.

```
type vec (a:Type) : nat -> Type =
    | Nil : vec a 0
    | Cons : #n:nat -> hd:a -> tl:vec a n -> vec a (n + 1)
```

Here, we're defining just a single type constructor called vec (i.e, just  $T_1$ ), which a single parameter (a:Type) and one index nat.

vec has two data constructors: Nil builds an instance of vec a 0, the empty vector; and Cons hd tl builds an instance of vec a (n + 1) from a head element hd:a and a tail tl: vec a n. That is, the two constructors build different instances of vec—those instances have the same parameter (a), but different indexes (0 and n + 1).

**Note:** Datatypes in many languages in the ML family, including OCaml and F#, have parameters but no indexes. So, all the data constructors construct the same instance of the type constructor. Further, all data constructors take at most one argument. If your datatype happens to be simple enough to fit these restrictions, you can use a notation similar to OCaml or F# for those types in F\*. For example, here's the option type defined in F\* using an OCaml-like notation.

```
type option a =
  | None
  | Some of a
```

This is equivalent to

```
type option a =
  | None : option a
  | Some : a -> option a
```

# 13.3 Getting an element from a vector

With our length-indexed vec type, one can write functions with types that make use of the length information to ensure that they are well-defined. For example, to get the i th element of a vector, one can write:

```
let rec get #a #n (i:nat{i < n}) (v:vec a n)
   : a
   = match v with
   | Nil -> false_elim()
   | Cons hd tl ->
      if i = 0 then hd
      else get (i - 1) tl
```

The type of  $get\ i\ v$  says that i must be less than n, where n is the length of v, i.e., that i is within bounds of the vector, which is enough to prove that  $get\ i\ v$  can always return an element of type a. Let's look a bit more closely at how this function is typechecked by  $F^*$ .

The first key bit is pattern matching v:

```
match v with
| Nil -> false_elim()
| Cons hd tl ->
```

In case v is Nil, we use the library function Prims.false\_elim: squash False -> a to express that this case is impossible. Intuitively, since the index i is a natural number strictly less than the length of the list, we should be able to convince  $F^*$  that n <> 0.

The way this works is that  $F^*$  typechecks the branch in a context that includes an *equation*, namely that the v:vec a n equals the pattern Nil: vec a 0. With the assumption that v== Nil in the context,  $F^*$  tries to check that false\_elim is well-typed, which in turn requires (): squash False. This produces an proof obligation sent to the SMT solver, which is able to prove False in this case, since from v= Nil we must have that v=0 which contradicts v=1. Put another way, the branch where v=1 Nil is unreachable given the precondition v=2.

**Note:** When a branch is unreachable, F\* allows you to just omit the branch altogether, rather than writing it an explicitly calling false\_elim. For example, it is more common to write:

```
let rec get #a #n (i:nat{i < n}) (v:vec a n)
   : a
   = let Cons hd tl = v in
    if i = 0 then hd
   else get (i - 1) tl</pre>
```

where let Cons hd tl = v pattern matches v against just Cons hd tl.  $F^*$  automatically proves that the other cases of the match are unreachable.

Now, turning to the second case, we have a pattern like this:

```
match v with | Cons hd tl ->
```

But, recall that Cons has an implicit first argument describing the length of t1. So, more explicitly, our pattern is of the form below, where t1: vec a m.

```
match v with
| Cons #m hd tl ->
```

 $F^*$  typechecks the branch in a context that includes the equation that  $v == Cons \# m \ hd \ tl$ , which lets the solve conclude that n == m + 1, from the type of Cons.

If i=0, we've found the element we want and return it.

Otherwise, we make a recursive call get (i - 1) tl and now F\* has to:

- Instantiate the implicit argument of get to m, the length of t1. That is, in explicit form, this recursive call is really get #m (i 1) t1. F\* does this by relying on a unification algorithm implemented as part of its type inference procedure.
- Prove that (i 1) < m, which follows from i < n and n == m + 1.
- Prove that the recursive call terminates, by proving that m << n, or, equivalently, since m and n are natural numbers, m < n. This is easy, since we have n == m + 1.

Let's try a few exercises. The main work is to find a type for the functions in question. Once you do, the rest of the code will "write itself".

## 13.4 Exercises

## 13.4.1 Exercise: Concatenating vectors

Click here for the exercise file.

Implement a function to concatenate vectors. It should have the following signature:

```
val append (#a:Type) (#n #m:nat) (v1:vec a n) (v2:vec a m)
: vec a (n + m)
```

#### **Answer**

```
let rec append #a #n #m (v1:vec a n) (v2:vec a m)
   : vec a (n + m)
   = match v1 with
   | Nil -> v2
   | Cons hd tl -> Cons hd (append tl v2)
```

## 13.4.2 Exercise: Splitting a vector

Write a function called  $split_at$  to split a vector v: vec a n at index i into its i-length prefix from position 0 and a suffix starting at i.

#### **Answer**

```
let rec split_at #a #n (i:nat{i <= n}) (v:vec a n)
    : vec a i & vec a (n - i)
    = if i = 0
        then Nil, v
    else let Cons hd tl = v in
        let l, r = split_at (i - 1) tl in
        Cons hd l, r</pre>
```

Write a tail-recursive version of split\_at. You will need a reverse function as a helper.

#### **Answer**

Bonus: Prove split\_at and split\_at\_tail are equivalent.

# 13.5 Vectors: Probably not worth it

Many texts about dependent types showcase length-indexed vectors, much as we've done here. Although useful as a simple illustrative example, the vec type we've seen is probably not what you want to use in practice. Especially in F\*, where regular lists can easily be used with refinement types, length-indexed vectors are redundant because we simply refine our types using a length function. The code below shows how:

```
module LList

let rec length #a (l:list a)

(continues on next page)
```

```
: nat
  = match 1 with
    | [] -> 0
    | _::tl -> 1 + length tl
let rec get #a (i:nat) (v:list a { i < length v })</pre>
  = let hd :: tl = v in
    if i = 0 then hd
    else get (i - 1) tl
let rec split_at #a (i:nat) (v:list a { i <= length v })</pre>
  : r:(list a & list a){
        length (fst r) == i / \setminus
        length (snd r) == (length v - i)
  = if i = 0
    then [], v
    else let hd :: tl = v in
         let 1, r = split_at (i - 1) tl in
         hd::1, r
let rec append #a (v1 v2:list a)
  : v:list a { length v == length v1 + length v2 }
  = match v1 with
    | [] -> v2
    | hd::tl -> hd :: append tl v2
```

In the next few sections, we'll see more useful examples of indexed inductive types than just mere length-indexed vectors.

**CHAPTER** 

### **FOURTEEN**

### **MERKLE TREES**

A Merkle tree is a cryptographic data structure designed by Ralph Merkle in the late 1970s and has grown dramatically in prominence in the last few years, inasmuch as variants of Merkle trees are at the core of most blockchain systems.

A Merkle tree makes use of cryptographic hashes to enable efficient cryptographic proofs of the authenticity of data stored in the tree. In particular, for a Merkle tree containing  $2^n$  data items, it only takes n hash computations to prove that a particular item is in the tree.

In this section, we build a very simple, but canonical, Merkle tree and prove it correct and cryptographically secure. And we'll use several indexed inductive types to do it. Thanks to Aseem Rastogi for this example!

# 14.1 Setting

Merkle trees have many applications. To motivate our presentation here, consider the following simple scenario.

A content provider (someone like, say, the New York Times) has a large archive of digital artifacts—documents, multimedia files, etc. These artifacts are circulated among users, but when receiving an artifact one may question its authenticity. One way to ensure the authenticity of received artifacts is for the content provider to use a digital signature based on a public-key cryptosystem and for users to verify these signatures upon receiving an artifact. However, signatures can be quite heavyweight for certain applications.

Instead, the content provider can organize their archive into a Merkle tree, a tree of hashes with the artifacts themselves stored at the leaves, such that a single hash associated with the root node of the tree authenticates *all* the artifacts in the tree. By publishing just this root hash, and associating with each artifact a path in the tree from the root to it, a skeptical client can quickly check using a small number of hash computations (logarithmic in the size of the entire archive) whether or not a given artifact is authentic (by recomputing the root hash and checking if it matches the known published root hash).

## 14.2 Intuitions

Our Merkle tree will be a full binary tree of height n storing  $2^n$  data items and their corresponding hashes at the nodes. The main idea of a Merkle tree is for each internal node to also maintain a *hash of the hashes* stored at each of its children. If the hash algorithm being used is cryptographically secure, in the sense that it is collision resistant (i.e., it is computationally hard to find two strings that hash to the same value), then the hash associated with the root node authenticates the content of the entire tree.

Informally, a Merkle tree is an authenticated data structure in that it is computationally hard to tamper with any of the data items in the tree while still producing the same root hash. Further, to prove that a particular data item d is in the tree, it suffices to provide the hashes associated with the nodes in the path from the root to that the leaf containing that item d, and one can easily check by comparing hashes that the claimed path is accurate. In fact, we can prove that if a

claimed path through the tree attests to the presence of some other item d' <> d, then we can construct a collision on the underlying hash algorithm—this property will be our main proof of security.

### 14.3 Preliminaries

We'll model the resources and the hashes we store in our tree as strings of characters. F\* standard library FStar. String provides some utilities to work with strings.

In the code listing below, we define the following

- 1string n, the type of strings of length n. Like the vec type, 1string is a length-indexed type; unlike vector it is defined using a refinement type rather than an indexed inductive type. Defining indexed types using refinements is quite common in F\*.
- concat, a utility to concatenate strings, with its type proving that the resulting string's length is the sum of the lengths of the input strings.
- hash\_size and hash, a parameter of our development describing the length in characters of a hash function. The F\* keyword assume allows you to assume the existence of a symbol at a given type. Use it with care, since you can trivially prove anything by including an assume nonsense: False.
- The type of resources we store in the tree will just be resource, an alias for string.

```
//Length-indexed strings
let lstring (n:nat) = s:string{String.length s == n}
//Concatenating strings sums their lengths
let concat #n #m (s0:lstring n) (s1:lstring m)
  : lstring (m + n)
  = FStar.String.concat_length s0 s1;
    s0 ^ s1
//A parameter, length of the hash in characters,
//e.g., this would be 32, if a character is 1 byte
//and we're using SHA-256
assume
val hash_size:nat
//The type of a hashed value
let hash_t = lstring hash_size
//The hash function itself
assume
val hash (m:string) : hash_t
//The type of resources stored in the tree
let resource = string
```

# 14.4 Defining the Merkle tree

The inductive type mtree below defines our Merkle tree. The type has *two* indices, such that mtree n h is the type of a Merkle tree of height n whose root node is associated with the hash h.

Leaves are trees of height 0 and are constructed using L res, where the hash associated with this node is just hash res, the hash of the resource stored at the leaf.

Internal nodes of the tree are constructed using N left right, where both the left and right trees have the same height n, producing a tree of height n + 1. More interestingly, the hash associated with N left right is hash (concat hl hr), the hash of the concatenation of hashes of the left and right subtrees.

```
type mtree: nat -> hash_t -> Type =
    | L:
        res:resource ->
        mtree 0 (hash res)

| N:
        #n:nat ->
        #hl:hash_t ->
        #hr:hash_t ->
        left:mtree n hl ->
        right:mtree n hr ->
        mtree (n + 1) (hash (concat hl hr))
```

In our previous examples like vectors, the index of the type abstracts, or summarizes, some property of the type, e.g., the length. This is also the case with mtree, where the first index is an abstraction summarizing only the height of the tree; the second index, being a cryptographic hash, summarizes the entire contents of the tree.

# 14.5 Accessing an element in the tree

A resource identifier resource\_id is a path in the tree from the root to the leaf storing that resource. A path is just a list of booleans describing whether to descend left or right from a node.

Just like a regular binary tree, it's easy to access an element in the tree by specifying its resource\_id.

#### 14.5.1 Exercise

Implement a function to access an element in a mtree in given a rid: list bool. Figuring out its type, including its decreases clause, is the most interesting part. The function itself is straightforward.

Exercise file

#### Answer

(continues on next page)

```
| b::ri' ->
if b then
get ri' (N?.left tree)
else
get ri' (N?.right tree)
```

## 14.6 The Prover

Unlike the ordinary get function, we can define a function get\_with\_evidence that retrieves a resource from the tree together with some evidence that that resource really is present in the tree. The evidence contains the resource identifier and the hashes of sibling nodes along the path from root to that item.

First, we define resource\_with\_evidence n, an indexed type that packages a res:resource with its rid:resource\_id and hashes:list hash\_t—both rid and hashes have the same length, which is the index of the constructed type.

The function get\_with\_evidence is similar to get, except as it returns from descending into a child node, it adds the hash of the other child node to the list of hashes.

```
type resource_with_evidence : nat -> Type =
  | RES:
      res:resource ->
      ri:resource id ->
     hashes:list hash_t { L.length ri == L.length hashes } ->
     resource_with_evidence (L.length ri)
/// Retrieves data references by the path, together with the hashes
/// of the sibling nodes along that path
let rec get_with_evidence (#h:_)
                          (rid:resource_id)
                          (tree:mtree (L.length rid) h)
  : Tot (resource_with_evidence (L.length rid))
        (decreases rid)
  = match rid with
    | [] ->
     RES (L?.res tree) [] []
    | bit::rid' ->
     let N #_ #hl #hr left right = tree in
     let p = get_with_evidence rid' left in
      if bit then
        let p = get_with_evidence rid' left in
        RES p.res rid (hr :: p.hashes)
      else
        let p = get_with_evidence rid' right in
        RES p.res rid (hl :: p.hashes)
```

In the cryptographic literature, this function is sometimes called *the prover*. A RES r ri hs is a claimed proof of the membership of r in the tree at the location specified by ri.

Going back to our motivating scenario, artifacts distributed by our content provider would be elements of the type resource\_with\_evidence n, enabling clients to verify that a given artifact is authentic, as shown next.

### 14.7 The Verifier

Our next step is to build a checker of claimed proofs, sometimes called *a verifier*. The function verify below takes a p:resource\_with\_evidence n, re-computes the root hash from the evidence presented, and checks that that hash matches the root hash of a given Merkle tree. Note, the tree itself is irrelevant: all that's needed to verify the evidence is *the root hash* of the Merkle tree.

The main work is done by compute\_root\_hash, shown below.

- In the first branch, we simply hash the resource itself.
- In the second branch, we recompute the hash from the tail of the path, and then based on which direction was taken, we either concatenate sibling hash on the left or the right, and hash the result.

Convince yourself of why this is type-correct—refer back to the description of *vectors*, if needed. For example, why is it safe to call L.hd to access the first element of hashes?

#### 14.8 Correctness

Now, we can prove our main correctness theorem, namely that get\_with\_evidence returns a resource with verifiable evidence.

```
// Correctness theorem:
//
// Using get_with_evidence's with compute_root_hash correctly
(continues on next page)
```

14.7. The Verifier

The proof is a simple proof by induction on the height of the tree, or equivalently, the length of the resource id.

In other words, evidence constructed by a honest prover is accepted by our verifier.

# 14.9 Security

The main security theorem associated with this construction is the following: if the verifier can be convinced to accept a resource with evidence of the form RES r rid hs, and if the resource in the Merkle tree associated with rid is *not* r, then we can easily construct a collision on the underlying cryptographic hash. Since the hash is meant to be collision resistant, one should conclude that it is at least as hard to convince our verifier to accept incorrect evidence as it is to find collisions on the underlying hash.

We start by defining the type of a hash\_collision, a pair of distinct strings that hash to the same value.

The security theorem shown below takes a tree and p:resource\_with\_evidence n, where the refinement on p states that the verifier accepts the evidence (verify p tree) although the resource associated with p.ri is not p.res: in this case, we can build a function, by induction on the height of the tree, that returns a hash collision.

(continues on next page)

```
| [] -> Collision p.res (L?.res tree)
| bit::rid' ->
 let N #_ #h1 #h2 left right = tree in
 let h' = compute_root_hash (tail p) in
 let hd :: = p.hashes in
 if bit then
   if h' = h1 then
      security left (tail p)
   else (
     String.concat_injective h1 h' h2 hd;
     Collision (concat h1 h2) (concat h' hd)
   )
 else
   if h' = h2 then
      security right (tail p)
     String.concat_injective h1 hd h2 h';
     Collision (concat h1 h2) (concat hd h')
```

We look at its cases in detail:

- In the base case, it's easy to construct a hash collision directly from the differing resources.
- Otherwise, we recompute the hash associate with the current node from the tail of the evidence presented, and the two cases of the left and right subtrees are symmetric.
  - If the recomputed hash matches the hash of the node, then we can generate a collision just by the induction hypothesis on the left or right subtree.
  - Otherwise, we can build a hash collision, relying on String.concat\_injective, a lemma from the library stating that the concatenation of two pairs of equal length strings are equal only if their components are. Knowing that h' <> h1 (or, symmetically, h' <> h2) this allows us to prove that the concatenations are unequal, although their hashes are, by assumption, equal.

## 14.10 Exercise

Implement a function to update an mtree at a given rid:resource\_id with a new resource res:resource. The resulting tree will have a new root hash, so you will have to return the new hash along with the updated tree.

Exercise file

#### Hint

One type of the update function could be as follows:

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#### Answer

```
let rec update_mtree' #h
                      (rid:resource_id)
                      (res:resource)
                      (tree:mtree (L.length rid) h)
   : Tot (mtree' (L.length rid))
         (decreases rid)
   = match rid with
     | [] -> MTree _ (L res)
     | hd :: rid' ->
       if hd
       then (
         let MTree _ t = update_mtree' rid' res (N?.left tree) in
         MTree _ (N t (N?.right tree))
       else (
         let MTree _ t = update_mtree' rid' res (N?.right tree) in
         MTree _ (N (N?.left tree) t)
```

One interesting part of our solution is that we never explicitly construct the hash of the nodes. Instead, we just use \_ and let F\* infer the calls to the hash functions.

# 14.11 Summary and Further Reading

In summary, we've built a simple but powerful authenticated data structure with a proof of its correctness and cryptographic security.

In practice, Merkle trees can be much more sophisticated than our the most basic one shown here. For instance, they can support incremental updates, contain optimizations for different kinds of workloads, including sparse trees, and be implemented using high-performance, mutable structures.

You can read more about various flavors of Merkle trees implemented in F\* in the following papers.

- EverCrypt, Section VII (B), describes a high-performance Merkle tree with fast incremental updates.
- FastVer describes the design and use of hybrid authenticated data strutures, including sparse Merkle trees, for applications such as verificable key-value stores.

**CHAPTER** 

### FIFTEEN

## **EQUALITY TYPES**

In an *early section* we learned that  $F^*$  supports at least two kinds of equality. In this section, we look in detail at definitional equality, propositional equality, extensional equality of functions, and decidable equality. These topics are fairly technical, but are core features of the language and their treatment in  $F^*$  makes essential use of an indexed inductive type, equals #t x y, a proposition asserting the equality of x:t and y:t.

Depending on your level of comfort with functional programming and dependent types, you may want to skip or just skim this chapter on a first reading, returning to it for reference if something is unclear.

# 15.1 Definitional Equality

One of the main distinctive feature of a type theory like  $F^*$  (or Coq, Lean, Agda etc., and in contrast with foundations like set theory) is that *computation* is a primitive notion within the theory, such that lambda terms that are related by reduction are considered identical. For example, there is no way to distinguish within the theory between  $(\lambda x.x)0$  and 0, since the former reduces in a single step of computation to the latter. Terms that are related by reduction are called *definitionally equal*, and this is the most primitive notion of equality in the language. Definitional equality is a congruence, in the sense that within any context T[], T[n] is definitionally equal to T[m], when n and m are definitionally equal.

Since definitionally equal terms are identical, all type theories, including  $F^*$ , will implicit allow treating a term v:t as if it had type t', provided t and t' are definitionally equal.

Let's look at a few examples, starting again with our type of length-indexed vectors.

```
type vec (a:Type) : nat -> Type =
   | Nil : vec a 0
   | Cons : #n:nat -> hd:a -> tl:vec a n -> vec a (n + 1)
```

As the two examples below show a v:vec a n is also has type vec a m when n and m are definitionally equal.

```
let conv_vec_0 (#a:Type) (v:vec a ((fun x -> x) 0))
    : vec a 0
    = v

let conv_vec_1 (#a:Type) (v:vec a ((fun x -> x + 1) 0))
    : vec a 1
    = v
```

In the first case, a single step of computation (a function application, or  $\beta$ -reduction) suffices; while the second case requires a  $\beta$ -reduction followed by a step of integer arithmetic. In fact, any computational step, including unfolding definitions, conditionals, fixpoint reduction etc. are all allowed when deciding if terms are definitionally equivalent—the

code below illustrates how  $F^*$  implicitly reduces the factorial function when deciding if two terms are definitionally equal.

```
let rec factorial (n:nat)
  : nat
  = if n = 0 then 1
    else n * factorial (n - 1)

let conv_vec_6 (#a:Type) (v:vec a (factorial 3))
  : vec a 6
  = v
```

Of course, there is nothing particularly special about the vec type or its indices. Definitional equality applies everywhere, as illustrated below.

```
let conv_int (x : (fun b -> if b then int else bool) true)
  : int
  = x + 1
```

Here, when adding 1 to x,  $F^*$  implicitly converts the type of x to int by performing a  $\beta$ -reduction followed by a case analysis.

# 15.2 Propositional Equality

Definitional equality is so primitive in the language that there is no way to even state within the terms that two terms are definitional equal, i.e., there is no way to state within the logic that two terms are related to each other by reduction. The closest one can get stating that two terms are equal is through a notion called a *provable equality* or propositional equality.

In thinking of propositions as types, we mentioned at the *very start of the book*, that one can think of a type t as a proposition, or a statement of a theorem, and e: t as a proof of the theorem t. So, one might ask, what type corresponds to the equality proposition and how are proofs of equality represented?

The listing below shows the definition of an inductive type equals #a x y representing the equality proposotion between x:a and y:a. Its single constructor Reflexivity is an equality proof.

Its easy to construct some simple equality proofs. In the second case, just as with our vector examples,  $F^*$  accepts Reflexivity # #6 as having type equals (factorial 3) 6, since equals 6 6 is definitionally equal to equals (factorial 3) 6.

```
let z_equals_z
  : equals 0 0
  = Reflexivity

let fact_3_eq_6
  : equals (factorial 3) 6
  = Reflexivity #_ #6
```

Although the only constructor of equals is Reflexivity, as the the following code shows, equals is actually an equivalence relation, satisfying (in addition to reflexivity) the laws of symmetry and transitivity.

```
let reflexivity #a (x:a)
    : equals x x
    = Reflexivity

let symmetry #a (x y : a) (pf:equals x y)
    : equals y x
    = Reflexivity

let transitivity #a (x y z : a) (pf1:equals x y) (pf2:equals y z)
    : equals x z
    = Reflexivity
```

This might seem like magic: how is it is that we can derive symmetry and transitivity from reflexivity alone? The answer lies in how F\* interprets inductive type definitions.

In particular, given an inductive type definition of type  $T \overline{p}$ , where  $\overline{p}$  is a list of parameters and,  $F^*$  includes an axiom stating that any value  $v: T \overline{p}$  must be an application of one of the constructors of  $T, D \overline{v}: T \overline{p'}$ , such that  $\overline{p} = \overline{p'}$ .

In the case of equality proofs, this allows  $F^*$  to conclude that every equality proof is actually an instance of Reflexivity, as shown below.

```
let uip_refl #a (x y:a) (pf:equals x y)
    : equals pf (Reflexivity #a #x)
    = Reflexivity
```

Spend a minute looking at the statement above: the return type is a statement of equality about equality proofs. Write down a version of uip\_refl making all implicit arguments explicit.

#### Answer

```
let uip_refl_explicit #a (x y:a) (pf:equals x y)
    : equals #(equals x y) pf (Reflexivity #a #x)
    = Reflexivity #(equals x y) #(Reflexivity #a #x)
```

In fact, from uip\_refl, a stronger statement showing that all equality proofs are equal is also provable. The property below is known as the *uniqueness of identity proofs* (UIP) and is at the core of what makes F\* an extensional type theory.

```
let uip #a (x y:a) (pf0 pf1:equals x y)
    : equals pf0 pf1
    = Reflexivity
```

The F\* module Prims, the very first module in every program's dependence graph, defines the equals type as shown here. The provable equality predicate (==) that we've used in several examples already is just a squashed equality proof, as shown below.

In what follows, we'll mostly use squashed equalities, except where we wish to emphasize the reflexivity proofs.

# 15.3 Equality Reflection

What makes  $F^*$  an *extensional* type theory (and unlike the *intensional* type theories implemented by Coq, Lean, Agda, etc.) is a feature known as equality reflection. Whereas intensional type theories treat definitional and provable equalities separate, in  $F^*$  terms that are provably equal are also considered definitionally equal. That is, if in a given context x = y is derivable, the x is also definitionally equal to y. This has some wide-reaching consequences.

### 15.3.1 Implicit conversions using provable equalities

Recall from the start of the chapter that v:vec a ((fun  $x \to x$ ) 0) is implicitly convertible to the type vec a 0, since the two types are related by congruence and reduction. However, as the examples below show, if a == b is derivable in the context, then v:a can be implicitly converted to the type b.

We do not require a proof of a == b to be literally bound in the context. As the example below shows, the hypothesis h is used in conjunction with the control flow of the program to prove that in the then branch aa : int and in the else branch bb : int.

In fact, with our understanding of equality proofs, we can better explain how case analysis works in  $F^*$ . In the code above, the then-branch is typechecked in a context including a hypothesis h\_then: squash (equals (x > 0) true), while the else branch includes the hypothesis h\_else: squash (equals (x > 0) false). The presence of these additional control-flow hypotheses, in conjunction with whatever else is in the context (in particular hypothesis h) allows us to derive (a == int) and (b == int) in the respective branches and convert the types of aa and bb accordingly.

### 15.3.2 Undecidability and Weak Normalization

Implicit conversions with provable equalities are very convenient—we have relied on it without noticing in nearly all our examples so far, starting from the simplest examples about lists to vectors and Merkle trees, and some might say this is the one key feature which gives  $F^*$  its programming-oriented flavor.

However, as the previous example hinted, it is, in general, undecidable to determine if a == b is derivable in a given context. In practice, however, through the use of an SMT solver,  $F^*$  can often figure out when terms are provably equal and convert using it. But, it cannot always do this. In such cases, the  $F^*$  standard library offers the following primitive (in FStar.Pervasives), which allows the user to write coerce\_eq pf x, to explicitly coerce the type of x using the equality proof pf.

```
let coerce_eq (#a #b:Type) (_:squash (a == b)) (x:a) : b = x
```

Another consequence of equality reflection is the loss of strong normalization. Intensional type theories enjoy a nice property ensuring that every term will reduce to a canonical normal form, no matter the order of evaluation. F\* does not have this property, since some terms, under certain evaluation orders, can reduce infinitely. However, metatheory developed for F\* proves that closed terms (terms without free variables) in the Tot effect do not reduce infinitely, and as a corollary, there are no closed proofs of False.

F\* includes various heuristics to avoid getting stuck in an infinite loop when reducing open terms, but one can craft examples to make F\*'s reduction macinery loop forever. As such, deciding if possibly open terms have the same normal form is also undecidable in F\*.

# 15.4 Functional Extensionality

Functional extensionality is a principle that asserts the provable equality of functions that are pointwise equal. That is, for functions f and g,  $\forall x. fx == gx$  implies f == g.

This principle is provable as a theorem in  $F^*$ , but only for function literals, or, equivalently,  $\eta$ -expanded functions. That is, the following is a theorem in  $F^*$ .

**Note:** Note, the proof of the theorem makes use of tactics, a topic we'll cover in a later chapter. You do not need to understand it in detail, yet. The proof roughly says to descend into every sub-term of the goal and try to rewrite it using the pointwise equality hypothesis hyp, and if it fails to just rewrite the sub-term to itself.

Unfortunately, functional extensionality does not apply to all functions. That is, the following is not provable in F\* nor is it sound to assume it as an axiom.

```
let funext =
    #a:Type ->
    (continues on next page)
```

```
#b:(a -> Type) ->
f:(x:a -> b x) ->
g:(x:a -> b x) ->
Lemma (requires (forall (x:a). f x == g x))
    (ensures f == g)
```

The problem is illustrated by the following counterexample, which allows deriving False in a context where funext is valid.

```
let f (x:nat) : int = 0
let g (x:nat) : int = if x = 0 then 1 else 0
let pos = x:nat{x > 0}
let full_funext_false (ax:funext)
    : False
    = ax #pos f g;
    assert (f == g);
    assert (f 0 == g 0);
    false_elim()
```

The proof works by exploiting the interaction with refinement subtyping. f and g are clearly not pointwise equal on the entire domain of natural numbers, yet they are pointwise equal on the positive natural numbers. However, from ax #pos f g we gain that f == g, and in particular that f 0 == g 0, which is false.

**Note:** The trouble arises in part because although ax: funext proves squash (equals #(pos -> int) f g), F\*'s encoding of the equality to the SMT solver (whose equality is untyped) treats the equality as squash (equals #(nat -> int) f g), which leads to the contradiction.

Further,  $\eta$ -equivalent functions in F\* are not considered provably equal. Otherwise, in combination with funext\_on\_eta, an  $\eta$ -equivalence principle leads to the same contradiction as funext\_false, as shown below.

```
let eta_equiv =
    #a:Type ->
    #b:(a -> Type) ->
    f:(x:a -> b x) ->
    Lemma (f == eta f)

let eta_equiv_false (ax:eta_equiv)
    : False
    = funext_on_eta #pos f g (fun x -> ());
        ax #pos f;
        ax #pos g;
        assert (f == g);
        assert (f 0 == g 0);
        false_elim()
```

The F\* standard library module FStar. FunctionalExtensionality provides more information and several utilities to work with functional extensionality on  $\eta$ -expanded functions.

Thanks in particular to Aseem Rastogi and Dominique Unruh for many insights and discussions related to functional extensionality.

### 15.5 Exercise

Leibniz equality leq x y, relates two terms x:a and y:a if for all predicates  $p:a \rightarrow Type$ , p a implies p b. That is, if no predicate can distinguish x and y, the they must be equal.

Define Leibniz equality and prove that it is an equivalence relation.

Then prove that Leibniz equality and the equality predicate equals x y defined above are isomorphic, in the sense that  $leq x y \rightarrow equals x y$  and  $equals x y \rightarrow leq x y$ .

Exercise file

#### Hint

The section on Leibniz equality here tells you how to do it in Agda.

```
let lbz_eq (\#a:Type) (x y:a) = p:(a -> Type) -> p x -> p y
// lbz_eq is an equivalence relation
let lbz_eq_refl #a (x:a)
 : lbz_eq x x
= fun p px -> px
let lbz_eq_trans #a (x y z:a) (pf1:lbz_eq x y) (pf2:lbz_eq y z)
  : lbz_eq x z
 = fun p px -> pf2 p (pf1 p px)
let lbz_eq_sym #a (x y:a) (pf:lbz_eq x y)
  : lbz_eq y x
  = fun p \rightarrow pf (fun (z:a) \rightarrow (p z \rightarrow p x)) (fun (px: p x) \rightarrow px)
// equals and lbz_eq are isomorphic
let equals_lbz_eq (#a:Type) (x y:a) (pf:equals x y)
  : lbz_eq x y
= fun p px -> px
let lbz_eq_equals (#a:Type) (x y:a) (pf:lbz_eq x y)
  : equals x y
  = pf (fun (z:a) -> equals x z) Reflexivity
```

# 15.6 Decidable equality and equality qualifiers

To end this chapter, we discuss a third kind of equality in F\*, the polymorphic *decidable equality* with the signature shown below taken from the F\* module Prims.

```
val ( = ) (#a:eqtype) (x y:a) : bool
```

On eqtype, i.e., a:Type{hasEq a}, decidable quality (=) and provable equality coincide, as shown below.

```
let dec_equals (#a:eqtype) (x y:a) (_:squash (x = y))
  : equals x y
  = Reflexivity

let equals_dec (#a:eqtype) (x y:a) (_:equals x y)
  : squash (x = y)
  = ()
```

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That is, for the class of eqtype, x = y returns a boolean value that decides equality. Decidable equality and eqtype were first covered in *an earlier chapter*, where we mentioned that several primitive types, like int and bool all validate the has Eq predicate and are, hence, instances of eqtype.

When introducing a new inductive type definition,  $F^*$  tries to determine whether or not the type supports decidable equality based on a structural equality of the representation of the values of that type. If so, the type is considered an eqtype and uses of the (=) operator are compiled at runtime to structural comparison of values provided by the target language chosen, e.g., OCaml, F#, or C.

The criterion used to determine whether or not the type supports equality decidable is the following.

Given an inductive type definition of T with parameters  $\overline{p}$  and indexes  $\overline{q}$ , for each constructor of D with arguments  $\overline{v}:t_v$ ,

- 1. Assume, or every type parameter  $t \in \overline{p}$ , has Eq t.
- 2. Assume, for recursive types, for all  $\overline{q}$ , has Eq  $(T \overline{p} \overline{q})$ .
- 3. For all arguments  $\overline{v:t_v}$ , prove has Eq  $t_v$ .

If the proof in step 3 succeds for all constructors, then F\* introduces an axiom  $\forall \, \overline{p} \, \overline{q}. (\forall t \in \overline{p}. \mathsf{hasEq} \, t) \Rightarrow \mathsf{hasEq} \, (T \, \overline{p} \, \overline{q}).$ 

If the check in step 3 fails for any constructor,  $F^*$  reports an error which the user can address by adding one of two qualifiers to the type.

1. noeq: This qualifier instructs  $F^*$  to consider that the type does not support decidable equality, e.g., if one of the constructors contains a function, as show below.

```
noeq
type itree (a:Type) =
    | End : itree a
    | Node : hd:nat -> tl:(nat -> itree a) -> itree a
```

2. unopteq: This qualifier instructs F\* to determine whether a given instance of the type supports equality, even when some of its parameters are not themselves instances of eqtype. This can be useful in situations such as the following:

```
unopteq
type t (f: Type -> Type) =
    | T : f bool -> t f

let _ = assert (hasEq (t list))

[@@expect_failure]
let _ = assert (hasEq (fun x -> x -> x))
```

This wiki page provides more information about equality qualifiers on inductive types.

**CHAPTER** 

### SIXTEEN

### CONSTRUCTIVE & CLASSICAL CONNECTIVES

In *an earlier chapter*, we learned about the propositional connectives  $\forall$ ,  $\exists$ ,  $\Rightarrow$ ,  $\iff$ ,  $\land$ ,  $\lor$ ,  $\neg$ , etc. Whereas in other logical frameworks these connectives are primitive, in a type theory like F\* these connectives are defined notions, built from inductive type definitions and function types. In this section, we take a closer look at these logical connectives, show their definitions, and present some utilities to manipulate them in proofs.

Every logical connective comes in two flavors. First, in its most primitive form, it is defined as an inductive or arrow type, giving a constructive interpretation to the connective. Second, and more commonly used in F\*, is a *squashed*, or proof-irrelevant, variant of the same connective—the squashed variant is classical rather than constructive and its proofs are typically derived by writing partial proof terms with the SMT filling in the missing parts.

Each connective has an *introduction* principle (which describes how to build proofs of that connective) and an *elimination* principle (which describes how to use a proof of that connective to build other proofs). Example uses of introduction and elimination principles for all the connectives can be found in ClassicalSugar.fst

All these types are defined in Prims, the very first module in all F\* programs.

#### 16.1 Falsehood

The empty inductive type is the proposition that has no proofs. The logical consistency of  $F^*$  depends on there being no closed terms whose type is empty.

```
type empty =
```

This definition might look odd at first: it defines an inductive type with *zero* constructors. This is perfectly legal in F\*, unlike in languages like OCaml or F#.

The squashed variant of empty is called False and is defined as shown below:

```
let False = squash empty
```

#### 16.1.1 Introduction

The False proposition has no introduction form, since it has no proofs.

### 16.1.2 Elimination

From a (hypothetical) proof of False, one can build a proof of any other type.

```
let empty_elim (#a:Type) (x:empty) : a = match x with
```

This body of elim\_false is a match expression with no branches, which suffices to match all the zero cases of the empty type.

FStar.Pervasives.false\_elim provides an analogous elimination rule for False, as shown below, where the termination check for the recursive call succeeds trivially in a context with x:False.

```
let rec false_elim (#a:Type) (x:False) : a = false_elim x
```

### **16.2 Truth**

The trivial inductive type has just a single proof, T.

```
type trivial = T
```

**Note:** Although isomorphic to the unit type with its single element (), for historic reasons,  $F^*$  uses the trivial type to represent trivial proofs. In the future, it is likely that trivial will just be replaced by unit.

The squashed form of trivial is written True and is defined as:

```
let True = squash trivial
```

#### 16.2.1 Introduction

The introduction forms for both the constructive and squashed variants are trivial.

```
let _ : trivial = T
let _ : True = ()
```

#### 16.2.2 Elimination

There is no elimination form, since proofs of trivial are vacuous and cannot be used to derive any other proofs.

# 16.3 Conjunction

A constructive proof of p and q is just a pair containing proofs of p and q, respectively.

```
type pair (p q:Type) = | Pair : _1:p -> _2:q -> pair p q
```

**Note:** This type is isomorphic to the tuple type p & q that we encountered previously *here*. F\* currently uses a separate type for pairs used in proofs and those used to pair data, though there is no fundamental reason for this. In the future, it is likely that pair will just be replaced by the regular tuple type.

The squashed form of conjunction is written  $/\setminus$  and is defined as follows:

```
let ( /\setminus ) (p q:Type) = squash (pair p q)
```

#### 16.3.1 Introduction

Introducing a conjunction simply involves constructing a pair.

```
let and_intro #p #q (pf_p:p) (pf_q:q)
    : pair p q
    = Pair pf_p pf_q
```

To introduce the squashed version, there are two options. One can either rely entirely on the SMT solver to discover a proof of p / q from proofs of p and q, which it is usually very capable of doing.

```
let conj_intro #p #q (pf_p:squash p) (pf_q: squash q)
  : Lemma (p /\ q)
  = ()
```

Or, if one needs finer control,  $F^*$  offers specialized syntax (defined in FStar.Classical.Sugar) to manipulate each of the non-trivial logical connectives, as shown below.

```
let conj_intro_sugar #p #q (pf_p:squash p) (pf_q: squash q)
    : squash (p /\ q)
    = introduce p /\ q
    with pf_p
    and pf_q
```

The sugared introduction form for conjunction is, in general, as follows:

```
introduce p /\ q //Term whose top-level connective is /\
with proof_of_p //proof_of_p : squash p
and proof_of_q //proof_of_q : squash q
```

#### 16.3.2 Elimination

Eliminating a conjunction comes in two forms, corresponding to projecting each component of the pair.

For the squashed version, we again have two styles, the first relying on the SMT solver.

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```
let conj_elim_1 #p #q (pf_pq:squash (p /\ q))
    : squash p
    = ()

let conj_elim_2 #p #q (pf_pq:squash (p /\ q))
    : squash q
    = ()
```

And a style using syntactic sugar:

```
let conj_elim_sugar_1 #p #q (pf_pq:squash (p /\ q))
    : squash p
    = eliminate p /\ q
    returns p
    with pf_p pf_q. pf_p

let conj_elim_sugar_2 #p #q (pf_pq:squash (p /\ q))
    : squash p
    = eliminate p /\ q
    returns q
    with pf_p pf_q. pf_q
```

# 16.4 Disjunction

A constructive proof of p or q is represented by the following inductive type:

```
type sum (p q:Type) =
    | Left : p -> sum p q
    | Right : q -> sum p q
```

The constructors Left and Right inject proofs of p or q into a proof of sum p q.

**Note:** Just like before, this type is isomorphic to the type either  $\, p \, q \, from \, FStar. Pervasives.$ 

The classical connective \/ described previously is just a squashed version of sum.

#### 16.4.1 Introduction

As with the other connectives, introducing a constructive disjunction is just a matter of using the Left or Right constructor.

To introduce the squashed version \/, one can either rely on the SMT solver, as shown below.

```
let or_intro_left #p #q (pf_p:squash p)
   : squash (p \/ q)
   = ()
```

(continues on next page)

```
let or_intro_right #p #q (pf_q:squash q)
    : squash (p \/ q)
    = ()
```

Or, using the following syntactic sugar, one can specifically provide a proof for either the Left or Right disjunct.

```
let or_intro_sugar_left #p #q (pf_p:squash p)
    : squash (p \/ q)
    = introduce p \/ q
        with Left pf_p

let or_intro_sugar_right #p #q (pf_q:squash q)
    : squash (p \/ q)
    = introduce p \/ q
        with Right pf_q
```

#### 16.4.2 Elimination

Eliminating a disjunction requires a motive, a goal proposition to be derived from a proof of sum p q or p \/ q.

In constructive style, eliminating sum p q amounts to just pattern matching on the cases and constructing a proof of the goal by applying a suitable goal-producing hypothesis.

The squashed version is similar, except the case analysis can either be automated by SMT or explicitly handled using the syntactic sugar.

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# 16.5 Implication

One of the elimination principles for disjunction used the implication connective ==>. Its definition is shown below:

```
let ( ==> ) (p q : Type) = squash (p -> q)
```

That is, ==> is just the squashed version of the non-dependent arrow type ->.

**Note:** In Prims, the definition of p ==> q is actually squash (p -> GTot q), a **ghost** function from p to q. We'll learn about this more when we encounter effects.

#### 16.5.1 Introduction

Introducing a constructive arrow p  $\rightarrow$  q just involves constructing a  $\lambda$ -literal of the appropriate type.

One can turn several kinds of arrows into implications, as shown below.

One option is to directly use a function from the FStar.Classical library, as shown below:

```
val impl_intro_tot (#p #q: Type) (f: (p -> q)) : (p ==> q)
```

However, this form is seldom used in F\*. Instead, one often works with functions between squashed propositions, or Lemmas, turning them into implications when needed. We show a few styles below.

Unlike the other connectives, there is no fully automated SMT-enabled way to turn an arrow type into an implication. Of course, the form shown above remains just sugar: it may be instructive to look at its desugaring, shown below.

FStar.Squash and FStar.Classical provide the basic building blocks and the sugar packages it into a more convenient form for use.

### 16.5.2 Elimination

Of course, the elimination form for a constructive implication, i.e., p -> q is just function application.

```
let arrow_elim #p #q (f:p -> q) (x:p) : q = f x
```

The elimination rule for the squashed form is the classical logical rule *modus ponens*, which is usually very well automated by SMT, as shown in <code>implies\_elim</code> below. We also provide syntactic sugar for it, for completeness, though it is seldom used in practice.

```
let implies_elim #p #q (pq:squash (p ==> q)) (pf_p: squash p)
    : squash q
    = ()

let implies_elim_sugar #p #q (pq:squash (p ==> q)) (pf_p: squash p)
    : squash q
    = eliminate p ==> q
    with pf_p
```

# 16.6 Negation

Negation is just a special case of implication.

In its constructive form, it corresponds to p -> empty.

In Prims, we define  $\sim p$  as p ==> False.

Being just an abbreviation for an implication to False, negation has no particular introduction or elimination forms of its own. However, the following forms are easily derivable.

## 16.6.1 Introduction (Exercise)

Prove the following introduction rule for negation:

Exercise file

```
val neg_intro #p (f:squash p -> squash False)
    : squash (~p)
```

#### **Answer**

```
let neg_intro #p (f:squash p -> squash False)
    : squash (~p)
    = introduce p ==> False
    with pf_p. f pf_p
```

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## 16.6.2 Elimination (Exercise)

Prove the following elimination rule for negation using the sugar rather than just SMT only.

```
val neg_elim #p #q (f:squash (~p)) (x:unit -> Lemma p)
: squash (~q)
```

Exercise file

#### Answer

```
let neg_elim #p #q (f:squash (~p)) (lem:unit -> Lemma p)
    : squash q
    = eliminate p ==> False
    with lem()
```

## 16.7 Universal Quantification

Whereas implication is represented by the non-dependent arrow  $p \rightarrow q$ , universal quantification corresponds to the dependent arrow  $x:t \rightarrow q$  x. Its classical form in forall (x:t). q x, and is defined in as shown below:

```
let ( forall ) #t (q:t -> Type) = squash (x:t -> q x)
```

**Note:** As with ==>, in Prims uses x:t -> GTot (q x), a ghost arrow, though the difference is not yet significant.

#### 16.7.1 Introduction

Introducing a dependent function type x:t -> p x is just like introducing a non-dependent one: use a lambda literal.

For the squashed form, F\* provides sugar for use with several styles, where names corresponding to each of the forall-bound variables on the introduce line are in scope for the proof term on the with line.

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Note, as forall\_intro\_3 shows, the sugar also works for forall quantifiers of arities greater than 1.

#### 16.7.2 Elimination

Eliminating a dependent function corresponds to dependent function application.

For the squashed version, eliminating a forall quantifier amounts to instantiating the quantifier for a given term. Automating proofs that require quantifier instantiation is a large topic in its own right, as we'll cover in a later section—this wiki page provides some hints.

Often, eliminating a universal quantifier is automated by the SMT solver, as shown below, where the SMT solver easily instantiates the quantified hypothesis f with a.

But,  $F^*$  also provides syntactic sugar to explicitly trigger quantifier insantiation (as shown below), where the terms provided on the with line are instantiations for each of the binders on the eliminate line.

Its desugaring may be illuminating:

### 16.8 Existential Quantification

Finally, we come to existential quantification. Its constructive form is a dependent pair, a dependent version of the pair used to represent conjunctions. The following inductive type is defined in Prims.

As with tuple2, F\* offers specialized syntax for dtuple2:

- Instead of dtuple2 a (fun (x:a) -> b x), one writes x:a & b x.
- Instead of writing Mkdtuple2 x y, one writes (| x, y |).

The existential quantifier exists (x:t). p x is a squashed version of the dependent pair:

```
let ( exists ) (#a:Type) (#b:a -> Type) = squash (x:a & b x)
```

#### 16.8.1 Introduction

Introducing a constructive proof of x:a & b x is just a question of using the constructor—we show a concrete instance below.

```
let dtuple2_intro (x:int) (y:int { y > x })
    : (a:int & b:int{b > a})
    = (| x, y |)
```

For the squashed version, introducing an exists (x:t). p x automatically using the SMT solver requires finding an instance a for the quantifier such that p a is derivable—this is the dual problem of quantifier instantiation mentioned with universal

In the first example below, the SMT solver finds the instantiation and proof automatically, while in the latter two, the user picks which instantiation and proof to provide.

```
let exists_intro_1 (#t:Type)
                   (#q:t -> Type)
                   (a:t) (b:t)
                   (f : squash (q a / q b))
  : squash (exists x. q x)
  = () //instantiation found by SMT, it chose a or b, unclear/irrelevant which
let exists_intro_2 (#t:Type)
                   (#q:t -> Type)
                   (a:t) (b:t)
                   (f : squash (q a))
                   (g : squash (q b))
  : squash (exists x. q x)
  = introduce exists x. q x
   with a //witness
    and f //proof term of q applied to witness
let exists_intro_3 (#t:Type)
                   (#q:t -> Type)
                   (a:t) (b:t)
```

(continues on next page)

```
(f : squash (q a /\ q b))
: squash (exists x. q x)
= introduce exists x. q x
with a
and f // f: squash (q a /\ q b) implicitly eliminated to squash (q a) by SMT
```

#### 16.8.2 Elimination

Just as with disjunction and conjunction, eliminating dtuple2 or exists requires a motive, a goal proposition that *does not mention* the bound variable of the quantifier.

For constructive proofs, this is just a pattern match:

For the exists, the following sugar provides an elimination principle:

Names corresponding to the binders on the eliminate line are in scope in the with line, which additionally binds a name for a proof term corresponding to the body of the existential formula. That is, in the examples above, x:t is implicitly in scope for the proof term, while  $pf_p:$  squash p.

### 16.8.3 Exercise

In a *previous exercise*, we defined a function to insert an element in a Merkle tree and had it return a new root hash and an updated Merkle tree. Our solution had the following signature:

Revise the solution so that it instead returns a dependent pair. dtuple2 is already defined in Prims, so you don't have to define it again.

Exercise file

#### Answer

```
let rec update #h
               (rid:resource_id)
               (res:resource)
               (tree:mtree (L.length rid) h)
   : Tot (h':_ & mtree (L.length rid) h')
         (decreases rid)
   = match rid with
     | [] -> (| _, L res |)
     | hd :: rid' ->
       if hd
       then (
         let (| _, t |) = update rid' res (N?.left tree) in
         (| _, N t (N?.right tree) |)
       )
       else (
         let (| _, t |) = update rid' res (N?.right tree) in
         (| _, N (N?.left tree) t|)
```

### SIMPLY TYPED LAMBDA CALCULUS

In this chapter, we look at how inductively defined types can be used to represent both raw data, inductively defined relations, and proofs relating the two.

By way of illustration, we develop a case study in the simply typed lambda calculus (STLC), a very simple programming language which is often studied in introductory courses on the semantics of programming languages. Its syntax, type system, and runtime behavior can be described in just a few lines. The main result we're interested in proving is the soundness of the type system, i.e., that if a program type checks then it can be executed safely without a certain class of runtime errors.

If you haven't seen the STLC before, there are several good resources for it available on the web, including the Software Foundations book, though we'll try to keep the presentation here as self-contained as possible. Thanks to Simon Forest, Catalin Hritcu, and Simon Schaffer for contributing parts of this case study.

# 17.1 Syntax

The syntax of programs e is defined by the context-free grammar shown below.

$$e ::= () | x | \lambda x : t.e_0 | e_0 e_1$$

This can be read as follows: a program e is either

- the unit value ();
- a variable x;
- a lambda term  $\lambda x : t.e_0$  associating a variable x to a type t and a some sub-program  $e_0$ ;
- or, the application of the sub-program  $e_0$  to another sub-program  $e_1$ .

The syntax of the type annotation t is also very simple:

$$t ::= \operatorname{unit} | t_0 \rightarrow t_1$$

A type t is either

- the unit type constant;
- or, arrow type  $t_0 \rightarrow t_1$  formed from two smaller types  $t_0$  and  $t_1$

This language is very minimalistic, but it can be easily extended with some other forms, e.g., one could add a type of integers, integer constants, and operators like addition and subtraction. We'll look at that as part of some exercises.

We'll define the syntax of types and programs formally in  $F^*$  as a pair of simple inductive datatypes typ (for types) and exp (for programs or expressions) with a constructor for each of the cases above.

The main subtlety is in the representation of variables. For example, ignoring the type annotations, in the term  $\lambda x.(\lambda x.x)$  the inner lambda binds a different x than the outer one, i.e., the term is equivalent to  $\lambda x.(\lambda y.y)$  and our representation of programs must respect this this convention. We'll use a technique called de Bruijn indices, where the names of the variables are no longer significant and instead each variable is represented by a natural number describing the number of  $\lambda$  binders that one must cross when traversing a term from the occurrence of the variable to that variable's  $\lambda$  binder.

For example, the terms  $\lambda x.(\lambda x.x)$  and  $\lambda x.(\lambda y.y)$  are both represented as  $\lambda_{\cdot}(\lambda_{\cdot}0)$ , since the inner occurrence of x is associated with the inner  $\lambda$ ; while  $\lambda x.(\lambda y.(\lambda z.x))$  is represented as  $\lambda_{\cdot}(\lambda_{\cdot}(\lambda_{\cdot}2))$ , since from the inner occurrence of x one must skip past  $\lambda_{\cdot}(\lambda_{\cdot}2)$  is represented as  $\lambda_{\cdot}(\lambda_{\cdot}2)$ , since from the inner occurrence of x one must skip past  $\lambda_{\cdot}2$  is to reach the  $\lambda_{\cdot}2$  associated with  $\lambda_{\cdot}2$ . Note, the variable names are no longer significant in de Bruijn's notation.

## 17.1.1 Representing types

The inductive type typ defined below is our representation of types.

```
type typ =
    | TUnit : typ
    | TArr : typ -> typ -> typ
```

This is entirely straightforward: a constructor for each case in our type grammar, as described above.

## 17.1.2 Representing programs

The representation of program expressions is shown below:

```
let var = nat
type exp =
    | EUnit : exp
    | EVar : var -> exp
    | ELam : typ -> exp -> exp
    | EApp : exp -> exp -> exp
```

This too is straightforward: a constructor for each case in our program grammar, as described above. We use a nat to represent variables var and ELam represents an annotated lambda term of the form  $\lambda_{:}t.e$ , where the name of the binder is omitted, since we're using de Bruijn's representation.

## 17.2 Runtime semantics

STLC has just one main computation rule to execute a program—the function application rule or a  $\beta$  reduction, as shown below:

$$(\lambda x : t.e_0) e_1 \longrightarrow e_0[x \mapsto e_1]$$

This says that when a  $\lambda$  literal is applied to an argument  $e_1$  the program takes a single step of computation to the body of the lambda literal  $e_0$  with every occurrence of the bound variable x replaced by the argument  $e_1$ . The substitution has to be careful to avoid "name capture", i.e., substituting a term in a context that re-binds its free variables. For example, when substituting  $y\mapsto x$  in  $\lambda x.y$ , one must make sure that the resulting term is **not**  $\lambda x.x$ . Using de Bruijn notation will help us make precise and avoid name capture.

The other computation rules in the language are inductively defined, e.g.,  $e_0$   $e_1$  can take a step to  $e'_0$   $e_1$  if  $e_0 \longrightarrow e'_0$ , and similarly for  $e_1$ .

By choosing these other rules in different ways one obtains different reduction strategies, e.g., call-by-value or call-by-name etc. We'll leave the choice of reduction strategy non-deterministic and represent the computation rules of the STLC as an indexed inductive type, step e e' encoding one or more steps of computation.

## 17.2.1 Formalizing an Operational Semantics

The inductive type step below describes a single step of computation in what is known as a "small-step operational semantics". The type step e e' is a relation between an initial program e and a program e' that results after taking one step of computation on some sub-term of e.

```
type step : exp -> exp -> Type =
 | Beta:
     t:typ ->
     e1:exp ->
     e2:exp ->
     step (EApp (ELam t e1) e2) (subst (sub_beta e2) e1)
  | AppLeft :
      #e1:exp ->
      e2:exp ->
      #e1':exp ->
     hst:step e1 e1' ->
      step (EApp e1 e2) (EApp e1' e2)
  | AppRight :
      e1:exp ->
      #e2:exp ->
      #e2':exp ->
     hst:step e2 e2' ->
      step (EApp e1 e2) (EApp e1 e2')
```

- The constructor Beta represents the rule for  $\beta$  reduction. The most subtle part of the development is defining subst and sub\_beta—we'll return to that in detail shortly.
- AppLeft and AppRight allow reducing either the left- or right-subterm of EApp e1 e2.

### **Exercise**

Define an inductive relation steps: exp -> exp -> Type for the transitive closure of step, representing multiple steps of computation.

Use this exercise file for all the exercises that follow.

### Answer

```
#e1:exp ->
#e2:exp ->
step e0 e1 ->
steps e1 e2 ->
steps e0 e2
```

## 17.2.2 Substitution: Failed Attempt

Defining substitution is the trickiest part of the system. Our first attempt will convey the main intuitions, but  $F^*$  will refuse to accept it as well-founded. We'll then enrich our definitions to prove that substitution terminates.

We'll define a substitution as a total function from variables var to expressions exp.

```
let sub0 = var -> exp
```

These kind of substitutions are sometimes called "parallel substitutions"—the each variable is substituted independently of the others.

When doing a  $\beta$  reduction, we want to substitute the variable associated with de Bruijn index 0 in the body of the function with the argument e and then remove the  $\lambda$  binder—sub\_beta0 does just that, replacing variable 0 with e and shifting other variables down by 1, since the  $\lambda$  binder of the function is removed.

The function subst s e applies the substitution s to e:

```
let sub_inc0 : sub0 = fun y -> EVar (y+1)
[@@expect_failure [19;19]]
let rec subst0 (s:sub0)
               (e:exp)
  : exp
  = match e with
    | EUnit -> EUnit
    \mid EVar x -> s x
    | EApp e1 e2 -> EApp (subst0 s e1) (subst0 s e2)
    | ELam t e1 -> ELam t (subst0 (sub_elam0 s) e1)
and sub_elam0 (s:sub0)
  : sub0
  = fun y ->
        if y=0
        then EVar y
        else subst0 sub_inc0 (s (y - 1))
```

- The EUnit case is trivial—there are no variables to substitute.
- In the variable case subst0 s (EVar x) just applies s to x.

- In the EApp case, we apply the substitution to each sub-term.
- The ELam case is the most interesting. To apply the substitution s to the body e1, we have to traverse a binder. The mutally recursive function sub\_elam0 s adjusts s to account for this new binder, which has de Bruijn index 0 in the body e1 (at least until another binder is encountered).
  - In sub\_elam0, if we are applying s to the newly bound variable at index 0, then we leave that variable unchanged, since s cannot affect it.
  - Otherwise, we have a variable with index at least 1, referencing a binder that is bound in an outer scope;
     so, we shift it down and apply s to it, and then increment all the variables in the resulting term (using sub\_inc0) to avoid capture.

This definition of substitution is correct, but  $F^*$  refuses to accept it since we have not convinced the typechecker that subst0 and sub\_elam0 actually terminate. In fact,  $F^*$  complains in two locations about a failed termination check.

**Note:** This definition is expected to fail, so the [@expect\_failure [19;19]] attribute on the definition asks F\* to check that the definition raises Error 19 twice. We'll look in detail as to why it fails, next.

### 17.2.3 Substitution, Proven Total

Informally, let's try to convince ourselves why subst0 and sub\_elam0 actually terminate.

- The recursive calls in the EApp case are applied to strictly smaller sub-terms (e0 and e1) of the original term e.
- In the ELam case, we apply subst0 to a smaller sub-term e1, but we make a mutally recursive call to sub\_elam0 s first—so we need to check that that call terminates. This is the first place where F\* complains.
- When calling sub\_elam0, it calls back to subst0 on a completely unrelated term s (y 1), and F\* complains that this may not terminate. But, thankfully, this call makes use only of the sub\_inc0 substitution, which is just a renaming substitution and which does not make any further recursive calls. Somehow, we have to convince F\* that a recursive call with a renaming substitution is fine.

To distinguish renamings from general substitutions, we'll use an indexed type sub r, shown below.

```
let sub (renaming:bool) =
  f:(var -> exp){ renaming <==> (forall x. EVar? (f x)) }
```

- sub true is the type of renamings, substitutions that map variables to variables.
- sub false are substitutions that map at least one variable to a non-variable.

It's easy to prove that **sub\_inc** is a renaming:

```
let sub_inc
    : sub true
    = fun y -> EVar (y+1)
```

The function sub\_beta shown below is the analog of sub\_beta0, but with a type that tracks whether it is a renaming or not.

```
else (EVar (y-1))  (* shift -1 *)
in
if not (EVar? e)
then introduce exists (x:var). ~(EVar? (f x))
    with 0 and ();
f
```

- The type says that sub\_beta e is a renaming if and only if e is itself a variable.
- Proving this type, particularly in the case where e is not a variable requires proving an existentially quantified formula, i.e., exists x. ~(EVar (subst\_beta e) x). As mentioned *previously*, the SMT solver cannot always automatically instantiate existential quantifiers in the goal. So, we introduce the existential quantifier explicitly, providing the witness 0, and then the SMT solver can easily prove ~(EVar (subst\_beta e) 0).

Finally, we show the definitions of subst and sub\_elam below—identical to subst0 and sub\_elam0, but enriched with types that allow expressing a termination argument to F\* using a 4-ary lexicographic ordering.

```
let bool_order (b:bool) = if b then 0 else 1
let is_var (e:exp) : int = if EVar? e then 0 else 1
let rec subst (#r:bool)
              (s:sub r)
              (e:exp)
  : Tot (e':exp { r ==> (EVar? e <==> EVar? e') })
        (decreases %[bool_order (EVar? e);
                      bool_order r;
                      1;
                      e])
  = match e with
    | EUnit -> EUnit
    | EVar x \rightarrow s x
    | EApp e1 e2 -> EApp (subst s e1) (subst s e2)
    | ELam t e1 -> ELam t (subst (sub_elam s) e1)
and sub_elam (#r:bool) (s:sub r)
  : Tot (sub r)
        (decreases %[1;
                      bool_order r;
                      0;
                      EVar 0])
  = let f : var -> exp =
      fun y ->
        if y=0
        then EVar y
        else subst sub_inc (s (y - 1))
    assert (not r ==> (forall x. \sim (EVar? (s x)) ==> \sim (EVar? (f (x + 1)))));
```

Let's analyze the recursive calls of subst and subst\_elam to see why this order works.

- Cases of subst:
  - The EUnit and EVar cases are trivial, as before.

- In EApp, e is definitely not a variable, so bool\_order (EVar? e) is 1. if e1 (respectively e2) are variables, then this recursive call terminates, the lexicographic tuple (0, \_, \_, \_) << (1, \_, \_, \_), regardles of the other values. Otherwise, the last component of the tuple decreases (since e1 and e2 are proper sub-terms of e), while none of the other components of the tuple change.</p>
- The call to sub\_elam s in ELam terminates because the third component of the tuple decreases from 1 to 0, while the first two do not change.
- The final recursive call to subst terminates for similar reasons to the recursive calls in the EApp case, since the type of sub\_elam guarantees that sub\_elam s is renaming if an only of s is (so the r bit does not change).
- Cases of sub\_elam, in the recursive call to subst sub\_inc (s (y 1)), we have already proven that sub\_inc is a renaming. So, we have two cases to consider:
  - If s (y 1) is a variable, then bool\_order (EVar? e), the first component of the decreases clause of subst is 0, which clearly precedes 1, the first component of the decreases clause of subst\_elam.
  - Otherwwise, s (y 1) is not a variable, so s is definitely not a renaming while sub\_inc is. So, the second second component of the decreases clause decreases while the first component is unchanged.

Finally, we need to prove that sub\_elam s is a renaming if and only if s is. For this, we need two things:

- First, strengthen the type of subst s to show that it maps variables to variables if and only if r is a renaming,
- Second, we need to instantiate an exisential quantifier in sub\_elam, to show that if s is not a renaming, then it must map some x to a non-variable and, hence, sub\_elam s (x + 1) is a non-variable too. One way to do this is by asserting this fact, which is a sufficient hint to the SMT solver to find the instantiation needed. Another way is to explicitly introduce the existential, as in the exercise below.

In summary, using indexed types combined with well-founded recursion on lexicographic orderings, we were able to prove our definitions total. That said, coming up with such orderings is non-trivial and requires some ingenuity, but once you do, it allows for relatively compact definitions that handle both substitutions and renamings.

### **Exercise**

Remove the first component of the decreases clause of both definitions and revise the definitions to make F\* accept it.

```
Your solution should have signature
```

#### Hint

Inline a case of subst in subst\_elam. The answer is included with the next problem below.

Replace the assertion in subst\_elam with a proof that explicitly introduces the existential quantifier.

#### **Answer**

```
let rec subst1 (#r:bool)
              (s:sub r)
              (e:exp)
  : Tot (e':exp { r ==> (EVar? e <==> EVar? e') })
        (decreases %[bool_order r;
                     1;
                     e])
  = match e with
    | EVar x -> s x
    | ELam t e1 -> ELam t (subst1 (sub_elam1 s) e1)
    | EApp e1 e2 -> EApp (subst1 s e1) (subst1 s e2)
    | EUnit -> EUnit
and sub_elam1 (#r:bool) (s:sub r)
  : Tot (sub r)
        (decreases %[bool_order r;
                     0;
                     EVar 0])
  = let f : var -> exp =
      fun y ->
        if y=0
        then EVar y
        else match s (y - 1) with
             | EVar x -> sub_inc x
             | e -> subst1 sub_inc e
    in
    introduce not r ==> (exists x. \sim (EVar? (f x)))
    with not_r.
      eliminate exists y. ~ (EVar? (s y))
      returns _
      with not_evar_sy.
        introduce exists x. ~(EVar? (f x))
        with (y + 1)
        and ()
    f
```

# 17.3 Type system

If when running a program, if one ends up with an term like () e (i.e., some non-function term like () being used as if it were a function) then a runtime error has occurred and the program crashes. A type system for the simply-typed lambda calculus is designed to prevent this kind of runtime error.

The type system is an inductively defined relation typing g e t between a

- typing environment g: env, a partial map from variable indexes in a particular scope to their annotated types;
- a program expression e:exp;

• and its type t:typ.

### 17.3.1 Environments

The code below shows our representation of typing environments env, a total function from variable indexes var to Some t or None.

```
let env = var -> option typ

let empty : env = fun _ -> None

let extend (t:typ) (g:env)
    : env
    = fun y -> if y = 0 then Some t
        else g (y-1)
```

- The empty environment maps all variables to None.
- Extending an an environment g associating a type t with a new variable at index 0 involves shifting up the indexes of all other variables in g by 1.

## 17.3.2 Typing Relation

The type system of STLC is defined by the inductively defined relation typing g e t shown below. A value of typing g e t is a derivation, or a proof, that e has type t in the environment g.

```
type typing : env -> exp -> typ -> Type =
  | TyUnit :
      #g:env ->
      typing g EUnit TUnit
  | TyVar :
      #g:env ->
      x:var{Some? (g x)} \rightarrow
      typing g (EVar x) (Some?.v (g x))
  | TyLam :
      #g :env ->
      t:typ ->
      #e1:exp ->
      #t':typ ->
      hbody:typing (extend t g) e1 t' ->
      typing g (ELam t e1) (TArr t t')
  | TyApp :
      #g:env ->
      #e1:exp ->
      #e2:exp ->
      #t11:typ ->
      #t12:typ ->
      h1:typing g e1 (TArr t11 t12) ->
```

(continues on next page)

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```
h2:typing g e2 t11 ->
typing g (EApp e1 e2) t12
```

- The type does not support decidable equality, since all its constructors contain a field g:env, a function-typed value without decidable equality. So, we mark the inductive with the noeq qualifier, as described previously.
- TyUnit says that the unit value EUnit has type TUnit in all environments.
- TyVar says that a variable x is well-typed only in an environment g that binds its type to Some t, in which case, the program EVar x has type t. This rule ensures that no out-of-scope variables can be used.
- TyLam says that a function literal ELam t e1 has type TArr t t' in environment g, when the body of the function e1 has type t' in an environment that extends g with a binding for the new variable at type t (while shifting and retaining all other ariables).
- Finally, TyApp allows applying e1 to e2 only when e1 has an arrow type and the argument e2 has the type of the formal parameter of e1—the entire term has the return type of e1.

# 17.4 Progress

It's relatively easy to prove that a well-typed non-unit or lambda term with no free variables can take a single step of computation. This property is known as *progress*.

### 17.4.1 Exercise

State and prove progress.

### Answer

### 17.5 Preservation

Given a well-typed term satisfying typing g e t and steps e e', we would like to prove that e' has the same type as e, i.e., typing g e' t. This property is known as *preservation* (or sometimes *subject reduction*). When taken in combination with *progress*, this allows us to show that a well-typed term can keep taking a step until it reaches a value.

The proof below establishes preservation for a single step.

- Since we know the computation takes a step, the typing derivation ht must be an instance of TyApp.
- In the AppLeft and AppRight case, we can easily use the induction hypothesis depending on which side actually stepped.
- The Beta case is the most interesting and requires a lemma about substitutions preserving typing.

The substitution lemma follows:

```
let subst_typing #r (s:sub r) (g1:env) (g2:env) =
    x:var{Some? (g1 x)} \rightarrow typing g2 (s x) (Some?.v (g1 x))
let rec substitution (#g1:env)
                      (#e:exp)
                      (#t:typ)
                      (#r:bool)
                      (s:sub r)
                      (#g2:env)
                      (h1:typing g1 e t)
                      (hs:subst_typing s g1 g2)
   : Tot (typing g2 (subst s e) t)
         (decreases %[bool_order (EVar? e); bool_order r; e])
   = match h1 with
     | TyUnit -> TyUnit
     | TyVar x \rightarrow hs x
     | TyApp hfun harg -> TyApp (substitution s hfun hs) (substitution s harg hs)
     | TyLam tlam hbody ->
       let hs'' : subst_typing (sub_inc) g2 (extend tlam g2) =
         fun x \rightarrow TyVar(x+1)
       in
       let hs' : subst_typing (sub_elam s) (extend tlam q1) (extend tlam q2) =
         fun y \rightarrow if y = 0 then TyVar y
                else substitution sub_inc (hs (y - 1)) hs''
       in
       TyLam tlam (substitution (sub_elam s) hbody hs')
```

It starts with a notion of typability of substitutions, subst\_typing s g1 g2, which that if a variable x has type g1 x, then s x must have that same type in g2.

The substitution lemma lifts this notion to expressions, stating that applying a well-typed substitution subst\_typing

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s g1 g2 to a term well-typed in g1 produces a term well-typed in g2 with the same type.

### 17.5.1 Exercise

Use the substitution lemma to state and prove the substitution\_beta lemma used in the proof of preservation.

#### Answer

### 17.5.2 Exercise

Prove a preservation lemma for multiple steps.

#### Answer

```
let rec preservation #e #e' #g #t (ht:typing g e t) (hs:steps e e')
    : Tot (typing g e' t)
        (decreases hs)
    = match hs with
    | Single s ->
        preservation_step ht s
    | Many s0 s1 ->
        let ht' = preservation_step ht s0 in
        preservation ht' s1
```

# 17.6 Exercise

Prove a type soundness lemma with the following statement:

### Answer

```
= if is_value e then Inl ()
else let (| e', s |) = progress ht in
let ht' = preservation_step ht s in
Inr (| e', Single s, ht' |)
```

# 17.7 Exercise

Add a step for reduction underneath a binder and prove the system sound.

#### **Answer**

```
(*
   Copyright 2014-2015
     Simon Forest - Inria and ENS Paris
     Catalin Hritcu - Inria
     Nikhil Swamy - Microsoft Research
  Licensed under the Apache License, Version 2.0 (the "License");
  you may not use this file except in compliance with the License.
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       http://www.apache.org/licenses/LICENSE-2.0
   Unless required by applicable law or agreed to in writing, software
   distributed under the License is distributed on an "AS IS" BASIS,
   WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
  See the License for the specific language governing permissions and
   limitations under the License.
*)
module Part2.STLC.Strong
open FStar.Classical.Sugar
(* Constructive-style progress and preservation proof for STLC with
  strong reduction, using deBruijn indices and parallel substitution. *)
type typ =
  | TUnit : typ
  | TArr : typ -> typ -> typ
let var = nat
type exp =
 | EUnit : exp
 | EVar : var -> exp
 | ELam : typ -> exp -> exp
  | EApp : exp -> exp -> exp
(* Parallel substitution operation `subst` *)
let sub (renaming:bool) =
    f:(var \rightarrow exp)\{ renaming \iff (forall x. EVar? (f x)) \}
let bool_order (b:bool) = if b then 0 else 1
let sub_inc
 : sub true
 = fun y \rightarrow EVar (y+1)
let is_var (e:exp) : int = if EVar? e then 0 else 1
```

(continues on next page)

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```
let rec subst (#r:bool)
              (s:sub r)
              (e:exp)
  : Tot (e':exp { r ==> (EVar? e <==> EVar? e') })
        (decreases %[bool_order (EVar? e);
                     bool_order r;
                     1;
                     e])
  = match e with
   | EVar x -> s x
    | ELam t e1 -> ELam t (subst (sub_elam s) e1)
    | EApp e1 e2 -> EApp (subst s e1) (subst s e2)
    | EUnit -> EUnit
and sub_elam (#r:bool) (s:sub r)
  : Tot (sub r)
        (decreases %[1;
                     bool_order r;
                     0;
                     EVar 0])
  = let f : var -> exp =
      fun y ->
        if y=0
        then EVar y
        else subst sub_inc (s (y - 1))
   introduce not r ==> (exists x. \sim (EVar? (f x)))
   with not_r.
      eliminate exists y. ~ (EVar? (s y))
      returns (exists x. ~ (EVar? (f x)))
      with (not_evar_sy:squash (~(EVar? (s y)))).
        introduce exists x. ~(EVar? (f x))
       with (y + 1)
       and ()
    f
let sub_beta (e:exp)
  : sub (EVar? e)
  = let f =
      fun (y:var) ->
       if y = 0 then e
                           (* substitute *)
        else (EVar (y-1)) (* shift -1 *)
   if not (EVar? e)
   then introduce exists (x:var). ~(EVar? (f x))
         with 0 and ();
    f
(* Small-step operational semantics; strong / full-beta reduction is
   non-deterministic, so necessarily as inductive relation *)
```

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```
type step : exp -> exp -> Type =
 | SBeta : t:typ ->
            e1:exp ->
            e2:exp ->
            step (EApp (ELam t e1) e2) (subst (sub_beta e2) e1)
  | SApp1 : #e1:exp ->
            e2:exp ->
            #e1':exp ->
            hst:step e1 e1' ->
            step (EApp e1 e2) (EApp e1' e2)
  | SApp2 : e1:exp ->
            #e2:exp ->
            #e2':exp ->
            hst:step e2 e2' ->
            step (EApp e1 e2) (EApp e1 e2')
  | STrans : #e0:exp ->
             #e1:exp ->
             #e2:exp ->
             step e0 e1 ->
             step e1 e2 ->
             step e0 e2
  | SStrong : t:typ ->
              e:exp ->
              e':exp ->
              step e e' ->
              step (ELam t e) (ELam t e')
(* Type system; as inductive relation (not strictly necessary for STLC) *)
type env = var -> option typ
let empty : env = fun _ -> None
(* we only need extend at 0 *)
let extend (t:typ) (g:env)
 : env
 = fun y \rightarrow if y = 0 then Some t
          else g (y-1)
noeq
type typing : env -> exp -> typ -> Type =
 | TyUnit : #g:env ->
             typing g EUnit TUnit
  | TyVar : #g:env ->
             x:var{Some? (g x)} \rightarrow
             typing g (EVar x) (Some?.v (g x))
                                                                              (continues on next page)
```

17.7. Exercise

```
| TyLam : #g :env ->
            t:typ ->
            #e1:exp ->
            #t':typ ->
            hbody:typing (extend t g) e1 t' ->
            typing g (ELam t e1) (TArr t t')
  | TyApp : #g:env ->
            #e1:exp ->
            #e2:exp ->
            #t11:typ ->
            #t12:typ ->
            h1:typing g e1 (TArr t11 t12) ->
            h2:typing g e2 t11 ->
            typing g (EApp e1 e2) t12
(* Progress *)
let is_value (e:exp) : bool = ELam? e || EUnit? e
let rec progress (#e:exp {~ (is_value e) })
                 (#t:typ)
                 (h:typing empty e t)
  : (e':exp & step e e')
  = let TyApp #g #e1 #e2 #t11 #t12 h1 h2 = h in
   match e1 with
    | ELam t e1' -> (| subst (sub_beta e2) e1', SBeta t e1' e2 |)
                 -> let (| e1', h1' |) = progress h1 in
                   (| EApp e1' e2, SApp1 e2 h1'|)
(* Typing of substitutions (very easy, actually) *)
let subst_typing #r (s:sub r) (g1:env) (g2:env) =
   x:var{Some? (g1 x)} \rightarrow typing g2 (s x) (Some?.v (g1 x))
(* Substitution preserves typing
   Strongest possible statement; suggested by Steven Schäfer *)
let rec substitution (#g1:env)
                     (#e:exp)
                     (#t:typ)
                     (#r:bool)
                     (s:sub r)
                     (#g2:env)
                     (h1:typing g1 e t)
                     (hs:subst_typing s g1 g2)
   : Tot (typing g2 (subst s e) t)
         (decreases %[bool_order (EVar? e); bool_order r; e])
  = match h1 with
   | TyVar x -> hs x
   | TyApp hfun harg -> TyApp (substitution s hfun hs) (substitution s harg hs)
   | TyLam tlam hbody ->
     let hs'' : subst_typing (sub_inc) g2 (extend tlam g2) =
```

```
fun x \rightarrow TyVar(x+1) in
     let hs' : subst_typing (sub_elam s) (extend tlam g1) (extend tlam g2) =
       fun y \rightarrow if y = 0 then TyVar y
             else substitution sub_inc (hs (y - 1)) hs''
     in TyLam tlam (substitution (sub_elam s) hbody hs')
   | TyUnit -> TyUnit
(* Substitution for beta reduction
  Now just a special case of substitution lemma *)
let substitution_beta #e #v #t_x #t #g
                       (h1:typing g v t_x)
                       (h2:typing (extend t_x g) e t)
  : typing g (subst (sub_beta v) e) t
  = let hs : subst_typing (sub_beta v) (extend t_x g) g =
        fun y \rightarrow if y = 0 then h1 else TyVar (y-1) in
    substitution (sub_beta v) h2 hs
(* Type preservation *)
let rec preservation #e #e' #g #t (ht:typing g e t) (hs:step e e')
  : Tot (typing g e' t)
        (decreases hs)
  = match hs with
    | STrans s0 s1 ->
      let ht' = preservation ht s0 in
      preservation ht' s1
    | _ ->
      match ht with
      | TyApp h1 h2 \rightarrow (
        match hs with
        | SBeta tx e1' e2' -> substitution_beta h2 (TyLam?.hbody h1)
        | SApp1 e2' hs1 -> TyApp (preservation h1 hs1) h2
        | SApp2 e1' hs2 -> TyApp h1 (preservation h2 hs2)
      | TyLam t hb ->
        let SStrong t e e' hs' = hs in
        let hb' = preservation hb hs' in
        TyLam t hb'
```

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**CHAPTER** 

### **EIGHTEEN**

### HIGHER-ORDER ABSTRACT SYNTAX

In the previous chapter, we looked at a *deep embedding* of the simply typed lambda calculus (STLC). The encoding is "deep" in the sense that we used an inductive type to represent the *syntax* of the lambda calculus in F\*, and then defined and proved some properties of its semantics represented mathematically in F\*.

Another way to embed a language like the STLC in  $F^*$  is a *shallow embedding*.  $F^*$  is itself a functional programming language, and it has a type system that is certainly powerful enough to represent simply typed terms, so why not use lambda terms in  $F^*$  itself to represent STLC, rather than merely encoding STLC's abstract syntax in  $F^*$ . This kind of encoding is called a shallow embedding, where we use semantic constructs in the host (or meta) language ( $F^*$ ) to represent analogous features of the embedded (or object) language (STLC, in our example).

In this chapter, we look at a particularly elegant technique for doing this called *higher-order abstract syntax* (or HOAS). For more background about this, a 2008 paper by Adam Chlipala is a good resource, though it develops a more sophisticated parametric version.

Our small case study in HOAS is meant to illustrate the use of inductive types with non-trivial indexes while also containing strictly positive functions as arguments, and also a bit of type-level computation.

# 18.1 Roadmap

The type typ below represents the types we'll use in our STLC object language, i.e., the base types Bool and Int, and function types Arrow t1 t2.

```
type typ =
    | Bool
    | Int
    | Arrow : typ -> typ
```

This is analogous to our representation of STLC types in the deep embedding of the previous chapter.

Where things get interesting is in the representation of STLC terms and their semantics. To set the goal posts, we want to

- 1. Give an interpretation of STLC types into F\* types, by defining a function denote\_typ : typ -> Type
- 2. Define a type term t, to represent well-typed STLC terms whose type is t:typ
- 3. Give an interpretation of STLC terms in to F\* terms of the suitable type, i.e., define a function denote\_term (#t:typ) (e:term t): denote\_typ t, proving that every well-typed STLC term at type t can be represented in F\* as a function of type denote\_typ t.

Such a result would encompass the type soundness results we proved in the previous chapter (proving that well-typed programs can always make progress), but would go substantially further to show that the reduction of all such terms always terminates producing  $F^*$  values that model their semantics.

# 18.2 Denotation of types

Step 1 in our roadmap is to give an interpretation of STLC types typ into  $F^*$  types. This is easily done, as shown below.

```
let rec denote_typ (t:typ)
  : Type
  = match t with
    | Bool -> bool
    | Int -> int
    | Arrow t1 t2 -> (denote_typ t1 -> denote_typ t2)
```

We have here a recursive function that computes a *Type* from its argument. This is may seem odd at first, but it's perfectly legal in a dependently typed language like F\*.

The function  $denote\_typ$  The interpretation of Bool and Int are the  $F^*$  type bool and int, while the interpretation of Arrow is an  $F^*$  arrow. Note, the function terminates because the two recursive calls are on strict sub-terms of the argument.

# 18.3 Term representation

The main difficulty in representing a language like STLC (or any language with lambda-like variable-binding structure), is the question of how to represent variables and their binders.

In the deep embedding of the previous chapter, our answer to this questions was very syntactic—variables are de Bruijn indexes, where, at each occurrence, the index used for a variable counts the number of lambdas to traverse to reach the binder for that variable.

The HOAS approach to answering these questions is very different. The idea is to use the binding constructs and variables already available in the host language (i.e., lambda terms in F\*) to represent binders and variables in the object language (STLC).

The main type in our representation of terms is the term defined below. There are several clever subtleties here, which we'll try to explain briefly.

First, the term type represents both the abstract syntax of the STLC as well as its typing rules. We'll see in detail how this works, but notice already that term is is indexed by a t:typ, which describes the type of encoded STLC term. The indexing structure encodes the typing rules of STLC, ensuring that only well-typed STLC terms can be constructed.

The second interesting part is the use of denote\_typ within the syntax—variables and binders at a given STLC type t will be represented by F\* variables and binders of the corresponding F\* type denote\_typ t.

- Var: Variables are represented as Var #t n : term t, where n is a term of type denote\_typ t.
- TT and FF: The two boolean constansts are represented by these constructors, both of type term Bool, where the index indicates that they have type Bool.
- I: STLC integers are represented by tagged F\* integers.
- App: To apply e1 to e2 in a well-typed way, we must prove that e1 has an arrow type TArrow t1 t2, while e2 has type t1, and the resulting term App e1 e2 has type t2. Notice how the indexing structure of the App constructor precisely captures this typing rule.
- Lam: Finally, and crucially, we represent STLC lambda terms using F\* functions, i.e., Lam f has type Arrow t1 t2, when f is represented by an F\* function from arguments of type denote\_typ t1, to terms of type term t. The Lam case includes a function-typed field, but the type of that field, denote\_typ t1 -> term t2 is strictly positive—unlike the dyn type, shown earlier.

## 18.4 Denotation of terms

Finally, we come to Step 3 (below), where we give an interpretation to term t as an F\* term of type denote\_typ t. The trickiest part of such a interpretation is to handle functions and variables, but this part is already done in the representation, since these are already represented by the appropriate F\* terms.

```
let rec denote_term (#t:typ) (e:term t)
    : Tot (denote_typ t)
            (decreases e)
    = match e with
    | Var x -> x
    | TT -> true
    | FF -> false
    | I i -> i
    | App f a -> (denote_term f) (denote_term a)
    | Lam f -> fun x -> denote_term (f x)
```

Let's look at each of the cases:

- The Var case is easy, since the variable x is already interpreted into an element of the appropriate F\* type.
- The constants TT, FF, and I are easy too, since we can just interpret them as the suitable boolean or integer constants.
- For the App #t1 #t2 f a case, we recursively interpret f and a. The type indices tell us that f must be interpreted into an F\* function of type denote\_typ t1 -> denote\_typ t2 and that denote\_term a has type denote\_typ t1. So, we can simply apply the denotation of f to the denotation of a to get a term of type denote\_typ t2. In other words, function application in STLC is represented semantically by function application in F\*.
- Finally, in the Lam #t1 #t2 f case, we need to produce a term of type denote\_typ t1 -> denote\_typ t2. So, we build an F\* lambda term (where the argument x has type denote\_typ t1), and in the body we apply f x and recursively call denote\_term on f x.

If that felt a little bit magical, it's because it almost is! We've defined the syntax, typing rules, and an interpreter that doubles as a denotational semantics for the STLC, and proved everything sound in around 30 lines of code and proof. By picking the right representation, everything just follows very smoothly.

## 18.4.1 Termination

You may be wondering why F\* accepts that denote\_term e terminates. There are three recursive calls to consider

- The two calls in the App case are easy: The recursive calls are on strict sub-terms of App f a.
- In the Lam f case, we have one recursive call denote\_term (f x), and F\* accepts that f x is strictly smaller than Lam f. This is an instance of the sub-term ordering on inductive types explained earlier, as part of F\*'s precedes relation, explained earlier.

For a bit of intuition, one way to understand the type term is by thinking of it as a tree of finite depth, but possibly infinite width:

- The leaves of the tree are the Var, TT, and FF cases.
- The internal node App e0 e1 composes two sub-trees, e0 and e1.
- The internal node Lam #t1 #t2 f composes a variable number of sub-trees, where the number of sub-trees depends on the parameter t1. For example:

```
    If t1 = Unit, then f : unit -> term v t, i.e., there is only one child node, f().
    If t1 = Bool, then f : bool -> term v t, i.e., there are two children, f true and f false.
    if t1 = Int, then f : int -> term v t, i.e., there are infinitely many children, ..., f -1, f 0, f 1, ....
```

With this intuition, informally, it is safe to recursively call denote\_term e on any of the children of e, since the depth of the tree will decrease on each recursive call. Hence the call denote\_term (f x) terminates.

We'll revisit termination arguments for recursive functions more formally in a subsequent chapter on well-founded recursion.

### 18.5 Exercises

Giving a semantics to STLC is just the tip of the iceberg. There's a lot more one can do with HOAS and Chlipala's paper gives lots of examples and sample code in Coq.

For several more advanced exercises, based on the definitions shown below, try reconstructing other examples from Chlipala's paper, including a proof of correctness of a compiler implementing a continuation-passing style (CPS) transformation of STLC.

Exercise file

```
(* This example is transcribed from Adam Chlipala's
    Parametric Higher-order Abstract Syntax (ICFP 2008) paper.

http://adam.chlipala.net/papers/PhoasICFP08/PhoasICFP08.pdf
*)
module Part2.PHOAS

type typ =
    | Bool
    | Arrow : typ -> typ -> typ

noeq
type term0 (v: typ -> Type) : typ -> Type =
    | Var : #t:typ -> v t -> term0 v t
```

```
| TT : term0 v Bool
  | FF : term0 v Bool
  | App : #t1:typ -> #t2:typ ->
          term0 v (Arrow t1 t2) ->
          term0 v t1 ->
          term0 v t2
  | Lam : #t1:typ -> #t2:typ ->
          (v t1 -> term0 v t2) ->
          term0 v (Arrow t1 t2)
let term (t:typ) = v:(typ -> Type) -> term0 v t
let rec denote_typ (t:typ)
  : Type
 = match t with
    | Bool -> bool
    | Arrow t1 t2 -> (denote_typ t1 -> denote_typ t2)
let rec denote_term0 (#t:typ) (e:term0 denote_typ t)
  : Tot (denote_typ t)
        (decreases e)
  = match e with
   | Var x -> x
    | TT -> true
    | FF -> false
    | App f a -> (denote_term0 f) (denote_term0 a)
    | Lam f \rightarrow fun x \rightarrow denote_term0 (f x)
let denote_term (t:typ) (e:term t)
  : denote_typ t
  = denote_term0 (e _)
```

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**CHAPTER** 

**NINETEEN** 

### WELL-FOUNDED RELATIONS AND TERMINATION

In an earlier chapter on *proofs of termination*, we learned about how F\* checks that recursive functions terminate. In this chapter, we see how the termination check arises from inductive types and structural recursion. Just as with *equality*, termination checking, a core feature of F\*'s logic and proof system, finds its foundation in inductive types.

For more technical background on this topic, the following resources may be useful:

- Constructing Recursion Operators in Type Theory, L. Paulson, Journal of Symbolic Computation (1986) 2, 325-355
- Modeling General Recursion in Type Theory, A. Bove & V. Capretta, Mathematical Structures in Computer Science (2005)

Thanks to Aseem Rastogi, Chantal Keller, and Catalin Hritcu, for providing some of the F\* libraries presented in this chapter.

- FStar.WellFounded.fst
- FStar.LexicographicOrdering

# 19.1 Well-founded Relations and Accessibility Predicates

A binary relation R on elements of type T is well-founded if there is no infinite sequence  $x_0, x_1, x_2, ...$ , such that  $x_i R x_{i+1}$ , for all i.

As explained *earlier*, when typechecking a recursive function f, f\* requires the user to provide a *measure*, some function of the arguments of f, and checks that on a recursive call, the measure of the arguments is related to the measure of the formal parameters a built-in well-founded relation on F\* terms. Since well-founded relations have no infinite descending chains, every chain of recursive calls related by such a relation must eventually terminate. However, this built-in well-founded relation, written << or precedes, is a derived notion.

In its most primitive form, the well-foundedness of a relation can be expressed in terms of an inductive type acc (short for "accessible") shown below.

```
let binrel a = a -> a -> Type
noeq
type acc (#a:Type) (r:binrel a) (x0:a) : Type =
   | AccIntro : access_smaller:(x1:a -> r x1 x0 -> acc r x1) -> acc r x0
```

The type acc is parameterized by a type a; a binary relation  $r: a \rightarrow a \rightarrow type$  on a; and an element of the type x:a. Informally, the relation r y x is provable when y is "smaller" than x.

The acc type has just one constructor AccIntro, whose only argument is a function of type  $y:a \rightarrow r y x \rightarrow acc r y$ . Intuitively, this says that in order to build an instance of acc r x0, you have to provide a function which can build a proof of acc r x1 for all x1:a smaller than x0. The only way to build such a function is one can avoid infinite

regress, is if the chain  $x0 r x1 r x2 r \dots$ , eventually terminates in some xn such that there are no elements smaller than it according to r.

In other words, if one can prove acc r x for all x:a, then this precisely captures the condition that there are no infinite descending r-related chains in a, or that r is well-founded. This is exactly what the definition below says, where is\_well\_founded is a classical (SMT-automatable) variant of well\_founded.

```
let well_founded (#a:Type) (r:binrel a) = x:a -> acc r x
let is_well_founded (#a:Type) (r:binrel a) = forall x. squash (acc r x)
```

# 19.2 Well-founded Recursion

Given a relation r and proof of  $p:acc\ r\ x$ , one can define a recursive function on x whose termination can be established purely in terms of structural recursion on the proof p, even though the function may not itself be structurally recursive on x.

The combinator fix\_F shown below illustrates this at work:

If f is a function such that every recursive call in the definition of f x is on an argument y, such that that y is smaller than x according to some relation r; and if starting from some argument x0, we have a proof of accessibility acc r x0 (i.e., no infinite descending r-chains starting at x0), then the fixpoint of f can be defined by structural recursion on the proof of accessible\_x0.

• fix\_F is structurally recursive on accessible\_x0 since the recursive call is on an element h1 y r\_yx, i.e., a child node of the (possibly infinitely branching) tree rooted at AccIntro h1.

A slightly simpler version of fix\_F is derivable if r is well-founded, i.e., r is accessible for all elements x:a.

# 19.3 Some Well-founded Relations

We show how to build some basic well-founded relations here. For starters, since F\* already internalizes that the < ordering on natural numbers as part of its termination check, it is easy to prove that < is well-founded.

```
let lt_nat (x y:nat) : Type = x < y == true
let rec wf_lt_nat (x:nat)
    : acc lt_nat x
    = AccIntro (fun y _ -> wf_lt_nat y)
```

We can also define combinators to derive well-founded relations from other well-founded relations. For example, if a relation  $\operatorname{sub\_r}$  is a *sub-relation* of a well-founded relation  $\operatorname{r}$  (meaning we have  $\operatorname{r} \operatorname{x} \operatorname{y}$  whenever we have  $\operatorname{sub\_r} \operatorname{x} \operatorname{y}$ ), then  $\operatorname{sub\_r}$  is well-founded too.

Another useful combinator derives the well-foundedness of a relation r: binrel b if it can be defined as the inverse image under some function f: a -> b of some other well-founded relation r: binrel.

For example, the > ordering on negative numbers can be proven well-founded by defining it as the inverse image of the < ordering on natural numbers.

```
let neg = x:int { x <= 0 }
let negate (x:neg) : nat = -x
let gt_neg : binrel neg = inverse_image lt_nat negate
let wf_gt_neg = inverse_image_wf negate wf_lt_nat</pre>
```

# 19.4 Termination Checking with Custom Well-founded Relations

In the  $F^*$  library, FStar.LexicographicOrdering, several other relations are proven to be well-founded, including the lexicographic ordering on dependent pairs.

```
: (x:a & b x) -> (x:a & b x) -> Type =
| Left_lex:
    x1:a -> x2:a ->
    y1:b x1 -> y2:b x2 ->
    r_a x1 x2 ->
    lexicographic_order r_a r_b (| x1, y1 |) (| x2, y2 |)

| Right_lex:
    x:a ->
    y1:b x -> y2:b x ->
    r_b x y1 y2 ->
    lexicographic_order r_a r_b (| x, y1 |) (| x, y2 |)
```

This order, defined as a binrel (x:a & b x), and is paramterized by a binary relation ( $r_a$ ) on a and a family of relations ( $r_b$ ) on b x, one for each x:a. It has two cases:

- Left\_lex: The first component of the pair decreases by r\_a, and the second component is irrelevant.
- Right\_lex: The first component of the pair is invariant, but the second component decreases by r\_b.

The proof is a little involved (see FStar.LexicographicOrdering.fst), but one can prove that it is well-founded when r\_a and r\_b are themselves well-founded, i.e.,

But, with this well-foundedness proof in hand, we can define recursive functions with our own well-founded orders.

To illustrate, let's define the ackermann function again (we saw it first *here*), this time using accessibilty and well-founded relations, rather than the built-in precedes relation.

```
//A type abbreviation for a pair of nats
// we're using dependent pairs, even though there's no real dependence here
let nat_pair = (x:nat & nat)
//Making a lexicographic ordering from a pair of nat ordering
let lex_order_nat_pair
  : binrel nat_pair
 = lexicographic_order lt_nat (fun _ -> lt_nat)
// The lex order on nat pairs is well-founded, using our general proof
// of lexicographic composition of well-founded orders
let lex_order_nat_pair_wf
  : well_founded lex_order_nat_pair
  = lexicographic_order_wf wf_lt_nat (fun _ -> wf_lt_nat)
// A utility to introduce lt_nat
let mk_lt_nat (x:nat) (y:nat { x < y })
  : lt_nat x y
  = let _ : equals (x < y) true = Refl in
```

```
()
// A utility to make a lex ordering of nat pairs
let mk_lex_order_nat_pair (xy0:nat_pair)
                         (xy1:nat_pair {
                           let (|x0, y0|) = xy0 in
                           let (|x1, y1|) = xy1 in
                           })
 : lex_order_nat_pair xy0 xy1
 = let (|x0, y0|) = xy0 in
   let (|x1, y1|) = xy1 in
   if x0 < x1 then Left_lex x0 x1 y0 y1 (mk_lt_nat x0 x1)</pre>
   else Right_lex x0 y0 y1 (mk_lt_nat y0 y1)
// Defining ackermann, where `arec` is called for recursive calls
// on pairs that precede xy, lexicographically
let ackermann' (xy: nat_pair)
              (arec: (xy':nat_pair -> lex_order_nat_pair xy' xy -> nat))
 : nat
 = let (| x, y |) = xy in
   if x = 0 then y + 1
   else if y = 0 then arec (| x - 1, 1 |) (mk_lex_order_nat_pair _ _)
   else arec (| x - 1, arec (| x, y - 1|) (mk_lex_order_nat_pair _ _) |)
             (mk_lex_order_nat_pair _ _)
// Tie the knot with `fix`
let ackermann : nat_pair -> nat = fix lex_order_nat_pair_wf (fun _ -> nat) ackermann'
```

This version is way more verbose than the ackermann we saw earlier—but this version demonstrates that F\*'s built-in support for the lexicographic orders over the precedes relation is semantically justified by a more primitive model of well-founded relations

To make user-defined well-founded orderings easier to work with,  $F^*$  actually provides a variant of the decreases clause to work with well-founded relations. For example, one can use the following syntax to gain from  $F^*$ 's built-in from SMT automation and termination checking, with the expressiveness of using ones own well-founded relation.

To explain the syntax:

• decreases {:well-founded p x}: Here, p is meant to be an instance for FStar. LexicographicOrdering.well\_founded\_relation, applied to some term x built from the formal parameters in scope.

• In this case, we use the combinator L.lex to build a lexicographic ordering from wf\_lt\_nat (coercing it using a utility coerce\_wf to turn the definitions used in our tutorial chapter here to the types expected by the FStar. LexicographicOrdering library).

We show the coercions below for completeness, though one would not necessarily need them outside the context of this tutorial.

```
module W = FStar.WellFounded
let rec coerce #a #r #x (p:acc #a r x)
  : Tot (W.acc r x) (decreases p)
  = W.AccIntro (fun y r -> coerce (p.access_smaller y r))
let coerce_wf #a #r (p: (x:a -> acc r x))
  : x:a -> W.acc r x
  = fun x -> coerce (p x)
```

**CHAPTER** 

**TWENTY** 

## A FIRST MODEL OF COMPUTATIONAL EFFECTS

As a final chapter in this section, we show how inductive types can be used model not just data, but also *computations*, including computations with side effects, like mutable state and shared-memory concurrency. This is meant to also give a taste of the next section in this book, which deals with modeling and proving properties of programs with effects and F\*'s user-extensible system of indexed effects.

Thanks to Guido Martinez and Danel Ahman, for some of the content in this chapter.

### 20.1 A First Taste: The State Monad

All the programs we've written so far have been purely functional. However, one can model programs that manipulate mutable state within a purely functional language, and one common but powerful way to do this is with something called a *monad*, an idea that was introduced to functional programmers in the late 1980s and early 90s by Philip Wadler building on semantic foundations developed by Eugenio Moggi. If you've been puzzled about monads before, we'll start from scratch here, and hopefully this time it will all make sense!

Consider modeling a program that manipulates a single piece of mutable state, just a single integer that programs can read and write, and which returns a result of type a. One way to do this is to represent such a *stateful computation* as a program whose type is st a:

```
let st a = int -> a & int
```

A (st a) computation is a function which when given an initial value for the state s0 returns a pair (x, s1) with the result of the computation x:a and a final value for the state s1.

For example, a computation that reads the state, increments it, and returns the initial value of the state, can be expressed as shown below.

```
let read_and_increment_v0
    : st int
    = fun s0 -> s0, s0 + 1
```

This is pretty straightforward, but writing computations in this style can be quite tedious and error prone. For example, if you wanted to read the state and increment it twice, one would write:

```
let inc_twice_v0
  : st int
  = fun s0 ->
    let x, s1 = read_and_increment_v0 s0 in
    let _, s2 = read_and_increment_v0 s1 in
    x, s2
```

This is quite clumsy, since at each call to read\_and\_increment\_v0 we had to be careful to pass it the "the most recent version" of the state. For instance, a small typo could easily have caused us to write the program below, where we pass s0 to the second call of read\_and\_increment, causing the program to only increment the state once.

```
let inc_twice_buggy
    : st int
    = fun s0 ->
        let x, s1 = read_and_increment_v0 s0 in
        let _, s2 = read_and_increment_v0 s0 in
        x, s2
```

The main idea with the state monad is to structure stateful programs by abstracting out all the plumbing related to manipulating the state, eliminating some of the tedium and possibilities for errors.

The way this works is by defining a functions to read and write the state, plus a couple of functions to return a pure value without reading or writing the state (a kind of an identity function that's a noop on the state); and a function to sequentially compose a pair of stateful computations.

• The function read: st int below, reads the state and returns it, without modifying the state.

```
let read
    : st int
    = fun s -> s, s
```

• The function write (s1:int): st unit below, sets the state to s1 and returns (): unit.

```
let write (s1:int)
   : st unit
   = fun _ -> (), s1
```

• The function bind is perhaps the most interesting. Given a stateful computation f: st a and another computation g: a -> st b which depends on the result of f and then may read or write the state returning a b; bind f g composes f and g sequentially, passing the initial state s0 to f, then passing its result x and next state s1 to g.

• Finally, return promotes a pure value x:a into an st a, without touching the state.

```
let return #a (x:a)
    : st a
    = fun s -> x, s
```

## 20.1.1 Some stateful programs

With these combinators in hand, we can write stateful programs in a more compact style, never directly manipulating the underlying integer variable that holds the state directly.

Here's a next attempt at read\_and\_increment:

```
let read_and_increment_v1 : st int =
  bind read (fun x ->
  bind (write (x + 1)) (fun _ ->
  return x))
```

Now, you're probably thinking that this version is even worse than read\_and\_increment\_v0! But, the program looks obscure "just" because it's using a convoluted syntax to call bind. Many languages, most famously Haskell, provide specialized syntax to simplify writing computations that work with APIs like bind and return. F\* provides some syntactic sugar to handle this too.

# 20.2 Monadic let bindings

The definition below defines a function with a special name let!. Names of this form, the token let followed by a sequence of one or more operator characters such as !, ?, @, \$, <, and > are monadic let-binding operators.

```
let (let!) = bind
```

With let! in scope, the following syntactic sugar becomes available:

- Instead of writing bind f (fun  $x \rightarrow e$ ) you can write let! x = f in e.
- Instead of writing bind f (fun \_ -> e) you can write f ;! e, i.e., a semicolon followed the sequence of operator characters uses in the monadic let-binding operator.
- Instead of writing bind f (fun x -> match x with ...), you can write match! f with ...
- Instead of writing bind f (fun  $x \rightarrow if x$  then ...), you can write if! f then ...

See this file MonadicLetBindings.fst for more details an examples of the syntactic sugar.

Using this syntactic sugar, we come to our final version of read\_and\_increment, where now, hopefully, the imperative-looking state updates make the intent of our program clear.

```
let read_and_increment : st int =
  let! x = read in
  write (x + 1) ;!
  return x
```

Having structured our programs with return and bind, larger st computations can be built from smaller ones, without having to worry about how to plumb the state through—that's handled once and for all by our combinators.

```
let inc_twice : st int =
  let! x = read_and_increment in
  read_and_increment ;!
  return x
```

### 20.2.1 st is a monad

It turns out that every API that is structured like our st is an instance of a general pattern called a *monad*, an algebraic structure. Specifically, a monad consists of:

```
A type operator m : Type -> Type
A function return (#a:Type) (x:a) : m a
A function bind (#a #b:Type) (f:m a) (g: a -> m b) : m b
```

which satisfy the following laws, where ~ is some suitable equivalence relation on m a

- Left identity: bind (return x) f  $\sim$  f
- Right identity: bind f return ~ f
- Associativity: bind f1 (fun x -> bind (f2 x) f3) ~ bind (bind f1 f2) f3

Its easy to prove that st, return, and bind satisfy these laws in F\*, where we pick the equivalence relation to equate functions that take equal arguments to equal results.

These laws are practically useful in that they can catch bugs in our implementations of the combinators. For instance, suppose we were to write bind\_buggy below, which like in inc\_twice\_buggy, mistakenly re-uses the old state s0 when calling g—in this case, the right\_identity law below cannot be proved.

We can also prove laws about how the stateful actions, read and write, interact with each other in sequential composition.

```
: Lemma ((write x ;! write y) `feq` write y)
= ()
let read_write_noop ()
: Lemma ((let! x = read in write x) `feq` return ())
= ()
```

That completes our tour of our very first monad, the state monad.

### 20.2.2 Exercise

Make the st type generic, so that instead of the state being fixed to a single integer value, it can be used with any type for the state. I.e., define st (s:Type) (a:Type): Type, where s is the type of the state.

Adapt the full development seen above to work with st s, including proving the various laws.

Exercise file

#### Answer

```
module Part2.ST
let st s a = s \rightarrow a & s
let read #s
  : st s s
  = fun s \rightarrow s, s
let write #s (s1:s)
  : st s unit
  = fun _ -> (), s1
let bind #s #a #b
          (f: st s a)
          (g: a \rightarrow st s b)
  : st s b
  = fun s0 ->
      let x, s1 = f s0 in
      g x s1
let return #s #a (x:a)
  : st s a
  = fun s \rightarrow x, s
let read_and_increment : st int int =
  x <-- read;
  write (x + 1);
  return x
let inc_twice : st int int =
  x <-- read_and_increment;</pre>
  read_and_increment;;
  return x
```

```
let feq #a #b (f g : a \rightarrow b) = forall x. f x == g x
let left_identity #s #a #b (x:a) (g: a -> st s b)
  : Lemma ((v <-- return x; g v) `feq` g x)
 = ()
let right_identity #s #a (f:st s a)
  : Lemma ((x <-- f; return x) `feq` f)
  = ()
let associativity #s #a #b #c (f1:st s a) (f2:a -> st s b) (f3:b -> st s c)
  : Lemma ((x <-- f1; y <-- f2 x; f3 y) `feq`
           (y \leftarrow (x \leftarrow f1; f2 x); f3 y))
  = ()
let redundant_read_elim ()
  : Lemma ((read;; read) `feq` read)
  = ()
let redundant_write_elim (x y:int)
  : Lemma ((write x ;; write y) `feq` write y)
  = ()
let read_write_noop ()
  : Lemma ((x <-- read; write x) `feq` return ())
  = ()
```

### 20.2.3 Exercise

Monads can be used to model many computational effects, not just mutable state. Another common example is to use monads to model computations that may raise runtime errors. Here's an exercise to help you see how.

Prove that the option type can be made into a monad, i.e., define bind and return and prove the monad laws.

Exercise file

# 20.3 Computation Trees, or Monads Generically

Each time one defines a monad to model a computational effect, one usually thinks first of the effectful *actions* involved (e.g., reading and writing the state, or raising an error), and then finds a way to package those actions into the interface of monad with return and bind, and then, to keep things honest, proves that the implementation satisfies the monad laws

However, a lot of this is boilerplate and can be done once and for all by representing effectful computations not just as functions (as we did with st = int -> a & s) but instead as an inductive type that models a *computation tree*, with effectful actions made explicit at each node in the tree. One can prove that this representation, sometimes called a *free monad*, is a monad, and then instantiate it repeatedly for the particular kinds of actions that one may want to use in given program.

**Note:** In this section, we're scratching the surface of a rich area of research called *algebraic effects*. While what we show here is not a full-blown algebraic effects development (we'll save that for a later chapter), here are some other resources about it.

- Alg.fst: An F\* development with algebraic effects (to be covered in detail later).
- Koka, a language with algebraic effects at its core
- A bibliography about effects

We'll start our development of computation trees with a type describing the signature of a language of actions.

```
noeq
type action_class = {
  t : Type;
  input_of : t -> Type;
  output_of : t -> Type;
}
```

This kind of signature is sometimes called a *type class*, a type act:Type, together with some operations it supports. In this case, the operations tell us what kind of input and output a given action expects.

**Note:**  $F^*$  also provides support for type classes and inference of type class instantiations. This will be described in a later chapter. Meanwhile, you can learn more about type classes in  $F^*$  from the wiki and from these examples.

For example, if we were interested in just the read/write actions on a mutable integer state (as in our st a example), we could build an instance of the action\_class, as shown below.

However, we can define a type tree acts a, the type of a computation tree whose effectful actions are from the class acts, completely generically in the actions themselves.

```
input:acts.input_of act ->
continue: (acts.output_of act -> tree acts a) ->
tree acts a
```

A tree act a has just two cases:

- Either it is a leaf node, Return x, modeling a computation that immediately returns the value x;
- Or, we have a node DoThen act input k, modeling a computation that begins with some action act, to which we pass some input, and where k represents all the possible "continuations" of the action, represented by a tree act a for each possible output returned by the action. That is, DoThen represents a node in the tree with a single action and a possibly infinite number of sub-trees.

With this representation we can define return and bind, and prove the monad laws once and for all.

```
let return #a #acts (x:a)
   : tree acts a
   = Return x

let rec bind #acts #a #b (f: tree acts a) (g: a -> tree acts b)
   : tree acts b
   = match f with
   | Return x -> g x
   | DoThen act i k ->
        DoThen act i (fun x -> bind (k x) g)
```

- The return combinator is easy, since we already have a Return leaf node in the tree type.
- The bind combinator is a little more interesting, involving a structural recursion over the tree, relying (as we did in the previous chapter on well-founded recursion) on the property that all the trees returned by k are strictly smaller than the original tree f.

To prove the monad laws, we first need to define an equivalence relation on trees—this relation is not quite just ==, since each continuation in the tree is function which itself returns a tree. So, we define equiv blow, relating trees that are both Returns, or when they both begin with the same action and have pointwise-equivalent continuations.

```
let rec equiv #acts #a (x y: tree acts a) =
  match x, y with
  | Return vx, Return vy -> vx == vy
  | DoThen actx ix kx, DoThen acty iy ky ->
  actx == acty /\
  ix == iy /\
   (forall o. equiv (kx o) (ky o))
  | _ -> False
```

**Note:** We are specifically avoiding the use of *functional extensionality* here, a property which allows equating pointwise equal  $\eta$ -expanded functions. We show how one can use functional extensionality in this development as an advanced exercise.

To prove that equiv is an equivalence relation, here are lemmas that prove that it is reflexive, symmetric, and transitive—we see here a use of the syntactic sugar for logical connectives, *introduced in a previous chapter*.

```
let rec equiv_refl #acts #a (x:tree acts a)
    : Lemma (equiv x x)
```

```
= match x with
   | Return v -> ()
    | DoThen act i k ->
     introduce forall o. equiv (k o) (k o)
      with (equiv_refl (k o))
let rec equiv_sym #acts #a (x y:tree acts a)
  : Lemma
    (requires equiv x y)
    (ensures equiv y x)
  = match x, y with
   | Return _ , Return _ -> ()
    | DoThen act i kx, DoThen _ _ ky ->
      introduce forall o. equiv (ky o) (kx o)
      with equiv_sym (kx o) (ky o)
let rec equiv_trans #acts #a (x y z: tree acts a)
  : Lemma
    (requires equiv x y /\ equiv y z)
    (ensures equiv x z)
  = match x, y, z with
    | Return _, _, _ -> ()
    | DoThen act i kx, DoThen _ _ ky, DoThen _ _ kz ->
      introduce forall o. equiv (kx o) (kz o)
      with equiv_trans (kx o) (ky o) (kz o)
```

Now, we can prove that tree satisifies the monad laws with respect to equiv.

```
let right_identity #acts #a #b (x:a) (g:a -> tree acts b)
  : Lemma (bind (return x) g `equiv` g x)
  = equiv_refl (g x)
let rec left_identity #acts #a (f:tree acts a)
  : Lemma (bind f return `equiv` f)
  = match f with
   | Return _ -> ()
    | DoThen act i k ->
      introduce forall o. bind (k o) return `equiv` (k o)
      with left_identity (k o)
let rec assoc #acts #a #b #c
              (f1: tree acts a)
              (f2: a -> tree acts b)
              (f3: b -> tree acts c)
  : Lemma (bind f1 (fun x -> bind (f2 x) f3) `equiv`
           bind (bind f1 f2) f3)
  = match f1 with
   | Return v ->
      right_identity v f2;
      right_identity v (fun x -> bind (f2 x) f3)
    | DoThen act i k ->
      introduce forall o. bind (k o) (fun x -> bind (f2 x) f3) `equiv`
```

```
bind (bind (k o) f2) f3
with assoc (k o) f2 f3
```

The associativity law, in particular, should make intuitive sense in that a tree acts a represents a computation in a canonical fully left-associative form, i.e., a single action followed by its continuation. As such, no matter how you associate computations in bind, the underlying representation is always fully left-associated.

Having defined our computation trees generically, we can use them with any actions we like. For example, here's our read\_and\_increment re-built using computation trees.

Finally, given a computation tree we can "run" it, by interpreting it as a state-passing function.

```
let st a = int -> a & int
let rec interp #a (f: tree rw_action_class a)
    : st a
    = fun s0 ->
        match f with
        | Return x -> x, s0
        | DoThen Read i k ->
            interp (k s0) s0
        | DoThen Write s1 k ->
        interp (k ()) s1
```

**Note:** A main difference between what we've shown here with interp and a general treament of algebraic effects is that rather than "bake-in" the interpretation of the individual actions in interp, we can also abstract the semantics of the actions using an idea similar to exception handling, allowing the context to customize the semantics of the actions simply by providing a different handler.

### 20.3.1 Exercise

Prove that the interp function interprets equivalent trees f and g to pointwise equivalent functions.

Exercise File

#### Answer

```
| DoThen act i kf, DoThen _ _ kg ->
introduce forall o. feq (interp (kf o)) (interp (kg o))
with interp_equiv (kf o) (kg o)
```

### 20.3.2 Exercise

Instead of proving every time that a function like interp produces equivalent results when applied to equivalent trees, using functional extensionality, we can prove that equivalent trees are actually provably equal, i.e., equiv x y ==> x == y.

This is a little technical, since although functional extensionality is a theorem in  $F^*$ , it is only true of  $\eta$ -expanded functions.

Try to use FStar.FunctionalExtensionality.fsti to adapt the definitions shown above so that we can prove the lemma equiv x y ==> x == y.

#### Answer

```
module Part2.FreeFunExt
open FStar.Classical.Sugar
module F = FStar.FunctionalExtensionality
open FStar.FunctionalExtensionality
noeq
type action_class = {
 t : Type;
  input_of : t -> Type;
 output_of : t -> Type;
}
noeq
type tree (acts:action_class) (a:Type) =
  | Return : x:a -> tree acts a
  | DoThen : act:acts.t ->
             input:acts.input_of act ->
             //We have to restrict continuations to be eta expanded
             //that what `^->` does. Its defined in FStar.FunctionalExtensionality
             continue:(acts.output_of act ^-> tree acts a) ->
             tree acts a
let return #a #acts (x:a)
  : tree acts a
  = Return x
let rec bind #acts #a #b (f: tree acts a) (g: a -> tree acts b)
  : tree acts b
  = match f with
    | Return x -> g x
    | DoThen act i k ->
      //Now, we have to ensure that continuations are instances of
```

```
//F.( \land -> )
      DoThen act i (F.on \_ (fun x -> bind (k x) g))
let rec equiv #acts #a (x y: tree acts a) =
 match x, y with
  | Return vx, Return vy -> vx == vy
  | DoThen actx ix kx, DoThen acty iy ky ->
   actx == acty /\
   ix == iy / \setminus
    (forall o. equiv (kx o) (ky o))
  | _ -> False
let rec equiv_refl #acts #a (x:tree acts a)
  : Lemma (equiv x x)
 = match x with
   | Return v -> ()
    | DoThen act i k ->
      introduce forall o. equiv (k o) (k o)
      with (equiv_refl (k o))
let rec equiv_sym #acts #a (x y:tree acts a)
  : Lemma
    (requires equiv x y)
    (ensures equiv y x)
  = match x, y with
   | Return _, Return _ -> ()
    | DoThen act i kx, DoThen _ _ ky ->
      introduce forall o. equiv (ky o) (kx o)
      with equiv_sym (kx o) (ky o)
let rec equiv_trans #acts #a (x y z: tree acts a)
  : Lemma
    (requires equiv x y /\ equiv y z)
    (ensures equiv x z)
  = match x, y, z with
    | Return _, _, _ -> ()
    | DoThen act i kx, DoThen _ _ ky, DoThen _ _ kz ->
      introduce forall o. equiv (kx o) (kz o)
      with equiv_trans (kx o) (ky o) (kz o)
// THIS IS THE MAIN LEMMA OF THE EXERCISE
let rec equiv_is_equal #acts #a (x y: tree acts a)
  : Lemma
    (requires equiv x y)
    (ensures x == y)
  = match x, y with
   | Return _, Return _ -> ()
    | DoThen act i kx, DoThen _ _ ky ->
      introduce forall o. kx o == ky o
      with equiv_is_equal (kx o) (ky o);
      F.extensionality _ _ kx ky
```

```
let right_identity #acts #a #b (x:a) (g:a -> tree acts b)
  : Lemma (bind (return x) g `equiv` g x)
 = equiv_refl (g x)
let rec left_identity #acts #a (f:tree acts a)
  : Lemma (bind f return `equiv` f)
 = match f with
   | Return _ -> ()
    | DoThen act i k ->
      introduce forall o. bind (k o) return `equiv` (k o)
      with left_identity (k o)
let rec assoc #acts #a #b #c
              (f1: tree acts a)
              (f2: a -> tree acts b)
              (f3: b -> tree acts c)
  : Lemma (bind f1 (fun x -> bind (f2 x) f3) `equiv`
           bind (bind f1 f2) f3)
  = match f1 with
   | Return v ->
      right_identity v f2;
      right_identity v (fun x -> bind (f2 x) f3)
    | DoThen act i k ->
      introduce forall o. bind (k o) (fun x -> bind (f2 x) f3) `equiv`
                     bind (bind (k o) f2) f3
      with assoc (k o) f2 f3
type rw =
 | Read
  | Write
let input_of : rw -> Type =
 fun a ->
   match a with
    | Read -> unit
    | Write -> int
let output_of : rw -> Type =
  fun a ->
   match a with
    | Read -> int
    | Write -> unit
let rw_action_class = { t = rw; input_of ; output_of }
//Here again the continuation has to be F.( ^-> )
let read : tree rw_action_class int = DoThen Read () (F.on _ Return)
let write (x:int) : tree rw_action_class unit = DoThen Write x (F.on _ Return)
let read_and_increment
 : tree rw_action_class int
 = x <-- read :
   write (x + 1);
```

```
return x
let st a = int -> a & int
let rec interp #a (f: tree rw_action_class a)
  = fun s0 ->
     match f with
     | Return x \rightarrow x, s0
     | DoThen Read i k ->
       interp (k s0) s0
     | DoThen Write s1 k ->
       interp (k ()) s1
// And now since equivalent trees and equal, lemmas such as this
// become trivial
let interp_equiv #a (f g:tree rw_action_class a)
  : Lemma
    (requires equiv f g)
    (ensures feq (interp f) (interp g))
  = equiv_is_equal f g
```

# 20.4 Manipulating Computation Trees: Nondeterminism and Concurrency

As a final bit, we show that representing computations as trees is not just useful from a perspective of genericity and code re-use. Computation trees expose the structure of a computation in a way that allows us to manipulate it, e.g., interpreting actions in an alternative semantics.

In this section, we enhance our computation trees to support non-deterministic choice, i.e., given pair of computations 1, r:tree acts a, we can non-deterministically choose to evaluate 1 or r. With this capability, we can also express some models of concurrency, e.g., a semantics that interleaves imperative actions from several threads.

Let's start by enhancing our tree type to now include an node Or 1 r, to represent non-deterministic choice between 1 and r.

As before, we can define return and bind, this time in bind we sequence g after both choices in Or.

```
let return #acts #a (x:a)
  : tree acts a
  = Return x
```

```
let rec bind #acts #a #b (f: tree acts a) (g: a -> tree acts b)
    : tree acts b
    = match f with
    | Return x -> g x
    | DoThen act i k ->
        DoThen act i (fun x -> bind (k x) g)
    | Or m0 m1 -> Or (bind m0 g) (bind m1 g)
```

What's more interesting is that, in addition to sequential composition, we can also define parallel composition of a pair of computations using par f g, as shown below.

```
let rec l_par #acts #a #b (f:tree acts a) (g:tree acts b)
  : tree acts (a & b)
  = match f with
    | Return v \rightarrow x \leftarrow g; return (v, x)
    | DoThen a i k ->
      DoThen a i (fun x -> r_par(k x) g)
    | \text{ Or m0 m1 } -> \text{ Or (l_par m0 g) (l_par m1 g)}
and r_par #acts #a #b (f:tree acts a) (g: tree acts b)
  : tree acts (a & b)
  = match g with
    | Return v \rightarrow x \leftarrow f; return (x, v)
    | DoThen a i k ->
      DoThen a i (fun x -> l_par f(k x))
    | Or m0 m1 -> Or (r_par f m0) (r_par f m1)
let par #acts #a #b (f: tree acts a) (g: tree acts b)
  : tree acts (a & b)
  = 0r (l_par f g) (r_par f g)
```

There's quite a lot going on here, so let's break it down a bit:

- The functions l\_par f g and r\_par f g are mutually recursive and define an interleaving semantics of the actions in f and g.
- l\_par f g is left-biased: picking an action from f to execute first (if any are left); while r\_par f g is right-biased, picking an action from g to execute first.
- Consider the DoThen case in 1\_par: if picks the head action a from f and the recurses in the continuation with r\_par (k x) g, to prefer executing first an action from g rather than k x. The DoThen case of r\_par is symmetric.
- For l\_par, in the non-deterministic choice case (0r), we interleave either choice of f with g, and r\_par is symmetric.
- Finally, we define parallel composition par f g as the non-deterministic choice of either the left-biased or right-biased interleaving of the actions of f and g. This fixes the semantics of parallel composition to a round-robin scheduling of the actions between the threads, but one could imagine implementing other kinds of schedulers too.

As before, we can now instantiate our tree with read/write actions and write some simple programs, including par\_inc, a computation that tries to increment the counter twice in parallel.

```
let read : tree rw_actions int = DoThen Read () Return
let write (x:int) : tree rw_actions unit = DoThen Write x Return
let inc
    : tree rw_actions unit
    = x <-- read ;
    write (x + 1)
let par_inc = par inc inc</pre>
```

However, there's trouble ahead—because of the interleaving semantics, we don't actually increment the state twice.

To check, let's define an interpretation function to run our computations. Since we need to resolve the non-deterministic choice in the Or nodes, we'll parameterize our interpreter by a source of "randomness", an infinite stream of booleans.

```
let randomness = nat -> bool
let par_st a = randomness -> pos:nat -> s0:int -> (a & int & nat)
let rec interp #a (f:tree rw_actions a)
  : par_st a
  = fun rand pos s0 ->
      match f with
      | Return x -> x, s0, pos
      | DoThen Read _ k -> interp (k s0) rand pos s0
      | DoThen Write s1 k -> interp (k ()) rand pos s1
      | Or 1 r ->
        if rand pos
        then interp 1 rand (pos + 1) s0
        else interp r rand (pos + 1) s0
let st a = int -> a & int
let interpret #a (f:tree rw_actions a)
  : st a
  = fun s0 ->
      let x, s, \_ = interp f (fun n -> n % 2 = 0) 0 s0 in
```

This interpreter is very similar to our prior interpreter, except in the Or case, we read a boolean from rand, our randomness stream, and choose the left- or right-branch accordingly.

We can run our program on this interpreter and check what it returns. One way to do this is to make use of  $F^*$ 's normalizer, the abstract machine that  $F^*$  uses to reduce computations during type-checking. The assert\_norm p feature used below instructs  $F^*$  to symbolically reduce the term p as much as possible and then check that the result is equivalent to True.

**Note:**  $F^*$ 's emacs mode fstar-mode.el provides some utilites to allow reducing terms of  $F^*$ 's abstract machine and showing the results to the user.  $F^*$ 's tactics also also allow evaluating terms and viewing the results—we leave further discussion of these features to a future chapter.

```
let test_prog = assert_norm (forall x. snd (interpret par_inc x) == x + 1)
```

In this case, we ask F\* to interpret par\_inc on the interpreter we just defined. And, indeed, F\* confirms that in the final state, we have incremented the state only once. Due to the round-robin scheduling of actions, the interpreter has executed both the reads before both the writes, making one of the reads and one of the writes redundant.

## 20.4.1 Exercise

Define an action class that include an increment operation, in addition to reads and writes. Adapt the interpreter shown above to work with this action class and prove (using assert\_norm) that a program that contains two parallel atomic increments increments the state twice.

Exercise File

Answer

```
type rwi =
 l R
 | W
  | Inc
let input_of_rwi : rwi -> Type =
  fun a ->
    match a with
    | R -> unit
    | W -> int
    | Inc -> unit
let output_of_rwi : rwi -> Type =
  fun a ->
    match a with
    | R -> int
    | W -> unit
    | Inc -> unit
let rwi_actions = { t = rwi; input_of=input_of_rwi ; output_of=output_of_rwi }
let atomic_inc : tree rwi_actions unit = DoThen Inc () Return
let rec interp_rwi #a (f:tree rwi_actions a)
  : par_st a
  = fun tape pos s0 ->
      match f with
      | Return x \rightarrow x, s0, pos
      | DoThen R _ k -> interp_rwi (k s0) tape pos s0
      | DoThen W s1 k -> interp_rwi (k ()) tape pos s1
      | DoThen Inc () k \rightarrow interp_rwi(k) tape pos (s0 + 1)
      | Or 1 r ->
        let b = tape pos in
        if b
        then interp_rwi l tape (pos + 1) s0
        else interp_rwi r tape (pos + 1) s0
let interpret_rwi #a (f:tree rwi_actions a)
  : st a
  = fun s0 ->
      let x, s, _ = interp_rwi f (fun n -> n % 2 = 0) 0 s0 in
let par_atomic_inc = par atomic_inc atomic_inc
let test_par_atomic_inc = assert_norm (forall x. snd (interpret_rwi par_atomic_inc x) ==__
\rightarrow x + 2)
```

# 20.5 Looking ahead

Writing correct programs with side-effects is hard, particularly when those effects include features like mutable state and concurrency!

What we've seen here is that although we've been able to model the semantics of these programs, proving that they work correctly is non-trivial. Further, while we have defined interpreters for our programs, these interpreters are far from efficient. In practice, one usually resorts to things like shared-memory concurrency to gain performance and our interpreters, though mathematically precise, are horribly slow.

Addressing these two topics is the main purpose of F\*'s user-defined effect system, a big part of the language which we'll cover in a subsequent section. The effect system aims to address two main needs:

- Proofs of effectful programs: The effect system enables developing effectful programs coupled with *program logics* that enable specifying and proving program properties. We'll learn about many different kinds of logics that F\* libraries provide, ranging from classical Floyd-Hoare logics for sequential programs, relational logics for program equivalence, weakest precondition calculi, and separation logics for concurrent and distributed programs.
- Effect abstraction: Although programs can be specified and proven against a clean mathematical semantics, for efficient execution, F\* provides mechanisms to hide the representation of an effect so that effectful programs can be compiled efficiently to run with native support for effects like state, exceptions, concurrency, and IO.

**CHAPTER** 

### **TWENTYONE**

# **UNIVERSES**

As mentioned *earlier*, Type is the type of types. So, one might ask the question, what is the type of Type itself? Indeed, one can write the following and it may appear at first that the type of Type is Type.

```
let ty : Type = Type
```

However, behind the scenes,  $F^*$  actually has a countably infinite hierarchy of types, Type u#0, Type u#1, Type u#2, ..., and the type of Type u#i is actually Type u#(i + 1). The u#i suffixes are called *universe levels* and if you give  $F^*$  the following option, it will actually show you the universe levels it inferred when it prints a term.

```
#push-options "--print_universes"
```

With this option enabled, in fstar-mode.el, the  $F^*$  emacs plugin, hovering on the symbol ty prints Type  $u\#(1 + \_)$ , i.e., the type of ty is in a universe that is one greater than some universe metavariable  $\_$ , i.e., ty is universe *polymorphic*. But, we're getting a bit ahead of ourselves.

In this chapter, we'll look at universe levels in detail, including why they're necessary to avoid paradoxes, and showing how to manipulate definitions that involve universes. For the most part, F\* infers the universe levels of a term and you don't have to think too much about it—in fact, in all that we've seen so far, F\* inferred universe levels behind the scenes and we haven't had to mention them. Though, eventually, they do crop up and understanding what they mean and how to work with them becomes necessary.

Other resources to learn about universes:

- The Agda manual has a nice chapter on universes, including universe polymorphism.
- This chapter from Adam Chlipala's Certified Programming with Dependent Types describes universes in Coq. While it also provides useful background, F\*'s universe system is more similar to Agda's and Lean's than Coq's.

## 21.1 Basics

A universe annotation on a term takes the form u#1, where 1 is a universe level. The universe levels are terms from the following grammar:

Let's revisit our first example, this time using explicit universe annotations to make things clearer.

We've defined, below, instances of Type for universe levels 0, 1, 2 and we see that each of them has a type at the next level. The constant Type u#0 is common enough that  $F^*$  allows you to write Type0 instead.

```
let ty0 : Type u#1 = Type u#0
let ty0' : Type u#1 = Type0
let ty1 : Type u#2 = Type u#1
let ty2 : Type u#3 = Type u#2
```

If you try to define ty\_bad below, F\* complains with the following error:

```
let ty_bad : Type u#0 = Type u#0
```

```
Expected expression of type "Type0"; got expression "Type0" of type "Type u#1"
```

The restriction that prevents a Type from being an inhabitant of itself if sometimes called *predicativity*. The opposite, *impredicativity*, if not suitably restricted, usually leads to logical inconsistency. F\* provides a limited form of impredicativity through the use of squash types, which we'll see towards the end of this chapter.

**Note:** That said, if we didn't turn on the option --print\_universes, the error message you get may be, sadly, bit baffling:

```
Expected expression of type "Type"; got expression "Type" of type "Type"
```

Turning on --print\_universes and --print\_implicits is a good way to make sense of type errors where the expected type and the type that was computed seem identical.

Now, instead of defining several constants like ty0, ty1, ty2 etc.,  $F^*$  definitions can be *universe polymorphic*. Below, we define  $ty\_poly$  as Type u#a, for any universe variable a, and so ty has type Type u#(a + 1).

```
let ty_poly : Type u#(a + 1) = Type u#a
```

One way to think of ty\_poly is as a "definition template" parameterized by the by the universe-variable a. One can instantiate ty\_poly with a specific universe level 1 (by writing ty\_poly u#1) and obtain a copy of its definition specialized to level 1. F\* can prove that instantiation of ty\_poly are equal to the non-polymorphic definitions we had earlier. As the last example shows, F\* can usually infer the universe instantiation, so you often don't need to write it.

```
let _ = assert (ty_poly u#0 == ty0)
let _ = assert (ty_poly u#1 == ty1)
let _ = assert (ty_poly u#2 == ty2)
let _ = assert (ty_poly == ty0)
```

# 21.2 Universe computations for other types

Every type in F\* lives in a particular universe. For example, here are some common types in Type u#0.

```
let _ : Type0 = nat
let _ : Type0 = bool
let _ : Type0 = nat -> bool
```

Universe of an arrow type: In general, the universe of an arrow type x:t -> t' is the the maximum of the universe of t and t'.

This means that functions that are type-polymorphic live in higher universes. For example, the polymorphic identity function that we saw in an *earlier section*, is actually also polymorphic in the universe level of its type argument.

```
let id_t : Type u#(i + 1) = a:Type u#i -> a -> a
let id : id_t = fun a x -> x
```

That is, the type of the identity function id is id\_t or a:Type u = -a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a in universe Type u = a —meaning, for all types a —meaning a —meaning, for all types a —meaning, for all types a —meaning, f

Now,  $id_t$  is itself a type in universe Type u#(i + 1), and since the id function can be applied to types in any universe, it can be applied to  $id_t$  too. So, it may look like this allows one to write functions that can be applied to themselves—which would be bad, since that would allow one to create infinite loops and break  $F^*$ 's logic.

```
let seemingly_self_application : id_t = id _ id
```

However, if we write out the universe levels explicitly, we see that actually we aren't really applying the id function to itself. Things are actually stratified, so that we are instead applying an instance of id at universe u#(i + 1) to the instance of id at universes u#i.

```
let stratified_application : id_t u#i = id u#(i + 1) (id_t u#i) (id u#i)
```

One intuition for what's happening here is that there are really infinitely many instances of the  $F^*$  type system nested within each other, with each instance forming a universe. Type-polymorphic functions (like id) live in some universe u#(a+1) and are parameterized over all the types in the immediately preceding universe u#a. The universe levels ensure that an  $F^*$  function within universe level u#a cannot consume or produce terms that live in some greater universe.

# 21.2.1 Universe level of an inductive type definition

F\* computes a universe level for inductive type definitions. To describe the rules for this in full generality, consider again the general form of an inductive type definition, shown first *here*, but this time with the universe level of each type constructor made explicit, i.e.,  $T_i$  constructs a type in universe Type u#|<sub>i</sub>

$$\text{type } T_1 \ \overline{(x_1:p_i)} : \overline{y_1:q_1} \to \text{Type } u\#l_1 = \overline{\bar{D}_1:t_1}$$
 and  $T_n \ \overline{(x_n:p_n)} : \overline{y_n:q_n} \to \text{Type } u\#l_n = \overline{\bar{D}_n:t_n}$ 

Recall that each type constructor  $T_i$  has zero or more data constructors  $\overline{D_i:t_i}$  and for each data constructor  $D_{ij}$ , its type  $t_{ij}$  must be of the form  $\overline{z_{ij}:s_{ij}}\to T_i\ \bar{x_i}\ \bar{e}$ 

In addition to checking, as usual, that the each  $t_{ij}$  is well-typed, F\* also checks the universe levels according to the following rule:

• Assuming that each  $T_i$  has universe level  $l_i$ , for every data constructor  $D_{ij}$ , and for each of its arguments  $z_{ijk}$ :  $s_{ijk}$ , check  $s_{ijk}$ : Type  $u \# l_{ijk}$  and  $l_{ijk} \le l_i$ .

In other words, the universe level of each type constructor must not be less than the universe of any of the fields of data constructors.

In practice, F\* infers the universe levels  $l_1, \ldots, l_n$ , by collecting level-inequality constraints and solving them using the max operator on universe levels, i.e.,  $l_i$  is set to  $\max_{jk} l_{ijk}$ , the maximum of the universe levels of all the fields of the constructors  $\overline{D_i:t_i}$ . Let's look at some examples.

#### The list type

The list type below is parameterized by a: Type u#a and constructs a type in the same universe.

```
type list (a:Type u#a) : Type u#a =
  | Nil : list a
  | Cons : hd:a -> tl:list a -> list a
```

- The Nil constructor has no fields, so it imposes no constraints on the universe level of list a.
- The Cons constructor has two fields. Its first field hd has type a: Type u#a: we have a constraint that u#a  $\leq$  u#a; and the second field, by assumption, has type list a: Type u#a, and again we have the constraint u#a  $\leq$  u#a.

F\* infers the minimum satisfiable universe level assignment, by default. But, there are many solutions to the inequalities, and if needed, one can use annotations to pick another solution. For example, one could write this, though it rarely makes sense to pick a universe for a type higher than necessary (see *this section* for an exception).

```
type list' (a:Type u#a) : Type u#(1 + a) =
    | Nil' : list' a
    | Cons' : hd:a -> tl:list' a -> list' a
```

**Note:** Universe level variables are drawn from a different namespace than other variables. So, one often writes a: Type u#a, where a is a regular variable and u#a is the universe level of the type of a.

### The pair type

The pair type below is parameterized by a:Type u#a and b:Type u#b and constructs a type in u#(max a b).

- The fst field is in u#a and so we have u#a < u#(max a b).
- The snd field is in u#b and so we have u#b  $\leq$  u#(max a b).

### The top type

The top type below packages a value at any type a:Type u#a with its type.

• The a field of Top is in u#(a + 1) while the v field is in u#a. So, top itself is in u#(max (a + 1) a), which simplifies to u#(a + 1).

One intuition for why this is so is that from a value of type t: top one can write a function that computes a value of type Type u#a, i.e., Top?.a t. So, if instead we have top: Type u#a and t:top, then Top?.a: top -> Type u#a, which would break the stratification of universes, since from a value top in universe u#a, we would be able to project out a value in Type u#(a + 1), which leads to a paradox, as we'll see next.

What follows is quite technical and you only need to know that the universe system exists to avoid paradoxes, not how such paradoxes are constructed.

# 21.3 Russell's Paradox

Type theory has its roots in Bertrand Russell's The Principles of Mathematics, which explores the logical foundations of mathematics and set theory. In this work, Russell proposed the paradoxical set  $\Delta$  whose elements are exactly all the sets that don't contain themselves and considered whether or not  $\Delta$  contained itself. This self-referential construction is paradoxical since:

- If  $\Delta \in \Delta$ , then since the only sets in  $\Delta$  are the sets that don't contain themselves, we can conclude that  $\Delta \not\in \Delta$ .
- On the other hand, if  $\Delta \not\in \Delta$ , then since  $\Delta$  contains all sets that don't contain themselves, we can conclude that  $\Delta \in \Delta$ .

To avoid such paradoxes, Russell formulated a stratified system of types to prevent nonsensical constructions that rely on self-reference. The universe levels of modern type theories serve much the same purpose.

In fact, as the construction below shows, if it were possible to break the stratification of universes in  $F^*$ , then one can code up Russell's  $\Delta$  set and prove False. This construction is derived from Thorsten Altenkirch's Agda code. Liam O'Connor also provides some useful context and comparison. Whereas the Agda code uses a special compiler pragma to enable unsound impredicativity, in  $F^*$  we show how a user-introduced axiom can simulate impredicativity and enable the same paradox.

# 21.3.1 Breaking the Universe System

Consider the following axioms that intentionally break the stratification of F\*'s universe system. We'll need the following ingredients:

1. A strictly positive type constructor lower that takes a type in any universe a: Type u#a, and returns a type in u#0. Note, we covered *strictly positive type functions, previously*.

```
assume
val lower ([@@@strictly_positive] a:Type u#a) : Type u#0
```

2. Assume there is a function called inject, which takes value of type x:a and returns value of type lower a.

```
    assume

    val inject (#a:Type u#a) (x:a) : lower a
```

3. lower and inject on their own are benign (e.g., let lower \_ = unit and let inject \_ = ()). But, now if we assume we have a function project that is the inverse of inject, then we've opened the door to paradoxes.

```
assume
val project (#a:Type u#a) (x:lower a) : a
assume
val inj_proj (#a:Type u#a) (x:a)
    : Lemma (project (inject x) == x)
```

# 21.3.2 Encoding Russell's Paradox

To show the paradox, we'll define a notion of set in terms of a form of set comprehensions f:  $x \rightarrow set$ , where x:Type u#0 is the domain of the comprehension, supposedly bounding the cardinality of the set. We'll subvert the universe system by treating set as living in universe u#0, even though its constructor Set has a field x:Type u#0 that has universe level u#1

```
noeq
type _set : Type u#1 =
   | Set : x:Type0 -> f:(x -> set) -> _set
and set : Type0 = lower _set
```

This construction allows us to define many useful sets. For example, the empty set zero uses the empty type False as the domain of its comprehension and so has no elements; or the singleton set one whose only element is the empty set; or the set two that contains the empty set zero and the singleton set one.

```
let zero : set = inject (Set False (fun _ -> false_elim()))
let one : set = inject (Set True (fun _ -> zero))
let two : set = inject (Set bool (fun b -> if b then zero else one))
```

One can also define set membership: A set a is a member of a set b, if one can exhibit an element v of the domain type of b (i.e., (project b).x), such that b's comprehension (project b).f applied to v is a.

For example, one can prove mem zero two by picking true for v and mem one two by picking false for v. Non-membership is just the negation of membership.

```
let mem (a:set) (b:set) : Type0 =
  (v:(project b).x & (a == (project b).f v))
let not_mem (a:set) (b:set) : Type0 = mem a b -> False
```

Now, we are ready to define Russell's paradoxical set  $\Delta$ . First, we define delta\_big in a larger universe and then use inject to turn it into a set: Type u#0. The encoding of delta\_big is fairly direct: Its domain type is the type of sets s paired with a proof that s does not contain itself; and its comprehension function just returns s itself.

```
let delta_big = Set (s:set & not_mem s s) dfst
let delta : set = inject delta_big
```

We can now prove both delta `mem` delta and delta `not\_mem` delta, using the unsound inj\_proj axiom that breaks the universe system, and derive False.

```
let delta_not_in_delta
  : not_mem delta delta
  = fun (mem_delta_delta:mem delta delta) ->
      x in delta x not in delta
          delta
          mem delta delta
         mem_delta_delta
let x_not_mem_x_x_mem_delta (x:set) (x_not_mem_x:x `not_mem` x)
  : x `mem` delta
 = let v : (s:set & not_mem s s) = (| x, x_not_mem_x |) in //an element of the domain_
→set of delta_big
    inj_proj delta_big; // the unsound axiom now lets us relate it to delta
   let s : (x == (project delta).f v) = //and prove that projecting delta's_
→ comprehension and applying to v return x`
        FStar.Squash.return_squash Refl
    in
    (|v, s|)
let delta_in_delta
  : mem delta delta
  = x_not_mem_x_x_mem_delta delta_not_in_delta
let ff : False = delta_not_in_delta delta_in_delta
```

The proofs are more detailed than they need to be, and if you're curious, maybe you can follow along by reading the comments.

The upshot, however, is that without the stratification of universes, F\* would be unsound.

# 21.4 Refinement types, FStar.Squash, prop, and Impredicativity

We've seen how universes levels are computed for arrow types and inductive type definitions. The other way in which types can be formed in  $F^*$  is with refinement types:  $x:t\{p\}$ . As we've seen previously, a value v of type  $x:t\{p\}$  is just a v:t where p[v/x] is derivable in the current scope in  $F^*$ 's SMT-assisted classical logic—there is no way to extract a proof of p from a proof of p: p[v/x], i.e., refinement types are p[v/x] is mechanism for proof irrelevance.

Universe of a refinement type: The universe of a refinement type  $x:t\{p\}$  is the universe of t.

Since the universe of a refinement type does not depend on p, it enables a limited form of impredicativity, and we can define the following type (summarized here from the F\* standard library FStar.Squash):

```
let squash (p:Type u#p) : Type u#0 = _:unit { p }
let return_squash (p:Type u#p) (x:p) : squash p = ()
```

This is a lot like the lower and inject assumptions that we saw in the previous section, but, importantly, there is no project operation to invert an inject. In fact, FStar.Squash proves that squash p is proof irrelevant, meaning that all proofs of squash p are equal.

```
val proof_irrelevance (p: Type u#p) (x y: squash p) : squash (x == y)
```

FStar.Squash does provide a limited way to manipulate a proof of p given a squash p, using the combinator bind\_squash shown below, which states that if f can build a proof squash b from any proof of a, then it can do so from the one and only proof of a that is witnessed by x:squash a.

```
val bind_squash (#a: Type u#a) (#b: Type u#b) (x: squash a) (f: (a → squash b)) : □ ⇒ squash b
```

It is important that bind\_squash return a squash b, maintaining the proof-irrelevance of the squash type. Otherwise, if one could extract a proof of a from squash a, we would be perilously close to the unsound project axiom which enables paradoxes.

This restriction is similar to Coq's restriction on its Prop type, forbidding functions that match on Prop to return results outside Prop.

The F\* type prop (which we saw first *here*) is defined primitively as type of all squashed types, i.e., the only types in prop are types of the form squash p; or, equivalently, every type t: prop, is a subtype of unit. Being the type of a class of types, prop in F\* lives in u#1

```
let _ : Type u#1 = prop
```

However, prop still offers a form of impredicativity, e.g., you can quantify over all prop while remaining in prop.

```
let _ : Type u#1 = a:prop -> a
let _ : Type u#0 = squash (a:prop -> a)
let _ : prop = forall (a:prop). a
let _ : prop = exists (a:prop). a
```

- The first line above shows that, as usual, an arrow type is in a universe that is the maximum of the universes of its argument and result types. In this case, since it has an argument prop: Type u#1 the arrow itself is in u#1.
- The second line shows that by squashing the arrow type, we can bring it back to u#0
- The third line shows the more customary way of doing this in F\*, where forall (a:prop). a is just syntactic sugar for squash (a:prop -> a). Since this is a squash type, not only does it live in Type u#0, it is itself a prop.
- The fourth line shows that the same is true for exists.

# 21.5 Raising universes and the lack of cumulativity

In some type theories, notably in Coq, the universe system is *cumulative*, meaning that Type u#i: Type u#i max (i + i) j); or, that Type u#i inhabits all universes greater than i. In contrast, in F\*, as in Agda and Lean, Type u#i: Type u#(i + 1), i.e., a type resides only in the universe immediately above it.

Cumulativity is a form of subtyping on universe levels, and it can be quite useful, enabling definitions at higher universes to be re-used for all lower universes. However, systems that mix universe polymorphism with cumulativity are quite tricky, and indeed, it was only recently that Coq offered both universe polymorphism and cumulativity.

Lacking cumulativity, F\* provides a library FStar.Universe that enables lifting a term from one universe to a higher one. We summarize it here:

```
val raise_t ([@@@ strictly_positive] t : Type u#a) : Type u#(max a b)
val raise_val (#a:Type u#a) (x:a) : raise_t u#a u#b a

(continues on next page)
```

```
val downgrade_val (#a:Type u#a) (x:raise_t u#a u#b a) : a

val downgrade_val_raise_val (#a: Type u#a) (x: a)
    : Lemma (downgrade_val u#a u#b (raise_val x) == x)

val raise_val_downgrade_val (#a: Type u#a) (x: raise_t u#a u#b a)
    : Lemma (raise_val (downgrade_val x) == x)
```

The type raise\_t t is strictly positive in t and raises t from u#a to u#(max a b). raise\_val and downgrade\_val are mutually inverse functions between t and raise\_t t.

This signature is similar in structure to the unsound signature for lower, inject, project that we use to exhibit Russell's paradox. However, crucially, the universe levels in raise\_t ensure that the universe levels *increase*, preventing any violation of universe stratification.

In fact, this signature is readily implemented in  $F^*$ , as shown below, where the universe annotation on raise\_t explicitly defines the type in a higher universe u#(max a b) rather than in its minimum universe u#a.

```
noeq
type raise_t (a : Type u#a) : Type u#(max a b) =
    | Ret : a -> raise_t a

let raise_val #a x = Ret x
let downgrade_val #a x = match x with Ret x0 -> x0
let downgrade_val_raise_val #a x = ()
let raise_val_downgrade_val #a x = ()
```

# 21.6 Tips for working with universes

Whenever you write Type in  $F^*$ , you are implicitly writing Type u#?x, where ?x is a universe *metavariable* left for  $F^*$  to infer. When left implicit, this means that  $F^*$  may sometimes infer universes for your definition that are not what you expect—they may be too general or not general enough. We conclude this section with a few tips to detect and fix such problems.

• If you see puzzling error messages, enable the following pragma:

```
#push-options "--print_implicits --print_universes"
```

This will cause F\* to print larger terms in error messages, which you usually do not want, except when you are confronted with error messages of the form "expected type t; got type t".

• Aside from the built-in constants Type u#a, the -> type constructor, and the refinement type former, the only universe polymorphic F\* terms are top-level definitions. That is, while you can define i at the top-level and use it polymorphically:

```
let i (#a:Type) (x:a) = x
let _ = i u#0 0, i u#1 nat, i u#2 (Type u#0)
```

You cannot do the same in a non-top-level scope:

```
let no_universe_poly_locally () =
  let i (#a:Type) (x:a) = x in
```

```
let _ = i u#0 0, i u#1 nat, i u#2 (Type u#0) in
()
```

Of course, non-universe-polymorphic definitions work at all scopes, e.g., here, the i is polymorphic in all types at universe u#0.

```
let type_poly_locally () =
  let i (#a:Type) (x:a) = x in
  let _ = i #unit (), i #bool true, i #nat 0 in
  ()
```

• If you write a val f: t declaration for f, F\* will compute the most general universe for the type t independently of the let f = e or type f = definition.

A simple example of this behavior is the following. Say, you declare tup2 as below.

```
    val
    tup2 (a:Type) (b:Type) : Type
```

Seeing this declaration  $F^*$  infers val tup2 (a:Type u#a) (b:Type u#b) : Type u#c, computing the most general type for tup2.

If you now try to define tup2,

```
let tup2 a b = a & b
```

F\* complains with the following error (with --print\_universes on):

```
Type u#(max uu___43588 uu___43589) is not a subtype of the expected type Type u#uu__ \rightarrow_43590
```

Meaning that the inferred type for the definition of tup2 a b is Type u#(max a b), which is of course not the same as Type u#c, and, sadly, the auto-generated fresh names in the error message don't make your life any easier.

The reason for this is that one can write a val f: t in a context where a definition for f may never appear, in which case F\* has to compute some universes for t—it chooses the most general universe, though if you do try to implement f you may find that the most general universe is too general.

A good rule of thumb is the following:

- Do not write a val declaration for a term, unless you are writing an *interface*. Instead, directly write a let or type definition and annotate it with the type you expect it to have—this will lead to fewer surprises. For example, instead of separating the val tup2 from let tup2 just write them together, as shown below, and F\* infers the correct universes.

```
let tuple2 (a:Type) (b:Type) : Type = a & b
```

- If you must write a val f: t, because, say, the type t is huge, or because you are writing an interface, it's a good idea to be explicit about universes, so that when defining f, you know exactly how general you have to be in terms of universes; and, conversely, users of f know exactly how much universe polymorphism they are getting. For example:

```
val tup2_again (a:Type u#a) (b:Type u#b) : Type u#(max a b)
let tup2_again a b = a & b
```

• When defining an inductive type, prefer using parameters over indexes, since usually type parameters lead to types in lower universes. For example, one might think to define lists this way:

```
noeq
type list_alt : Type u#a -> Type u#(a + 1) =
   | NilAlt: a:Type -> list_alt a
   | ConsAlt: a:Type -> hd:a -> tl:list_alt a -> list_alt a
```

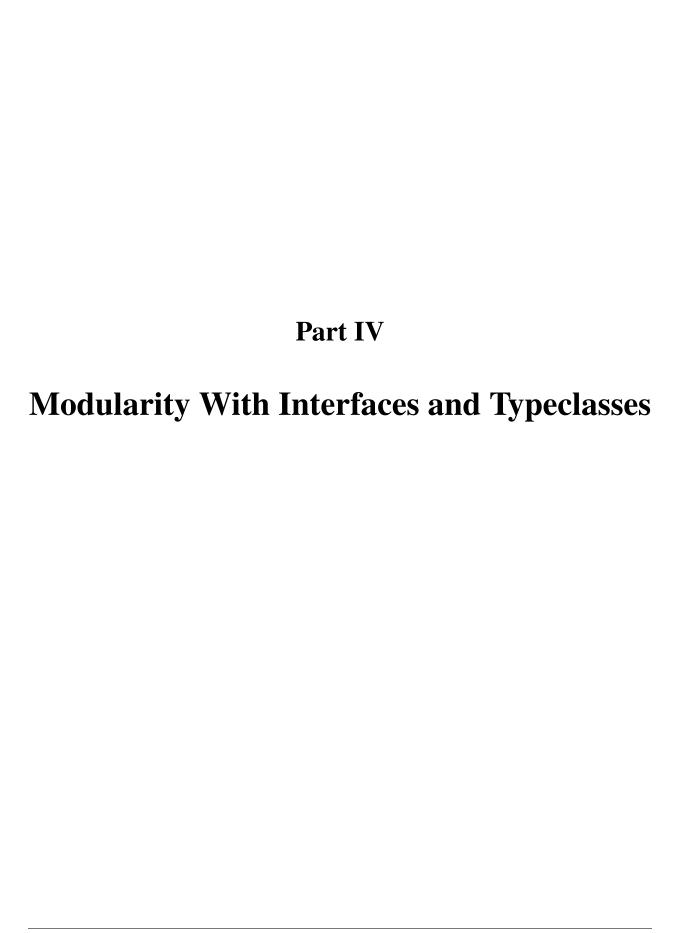
Although semantically equivalent to the standard list

```
type list (a:Type u#a) : Type u#a =
  | Nil : list a
  | Cons : hd:a -> tl:list a -> list a
```

list\_alt produces a type in u#(a + 1), since both NilAlt and ConsAlt have fields of type a:Type u#a. So, unless the index of your type varies among the constructors, use a parameter instead of an index.

That said, recall that it's the fields of the constructors of the inductive type that count. You can index your type by a type in any universe and it doesn't influence the result type. Here's an artificial example.

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In this section, we'll learn about two abstraction techniques used to structure larger F\* developments: *interfaces* and *typeclasses*.

**Interfaces**: An F\* module M (in a file M.fst) can be paired with an interface (in a file M.fsti). A module's interface is a subset of the module's declarations and definitions. Another module Client that uses M can only make use of the part of M revealed in its interface—the rest of M is invisible to Client. As such, interfaces provide an abstraction mechanism, enabling the development of Client to be independent of any interface-respecting implementation of M.

Unlike module systems in other ML-like languages (which provide more advanced features like signatures, functors, and first-class modules), F\*'s module system is relatively simple.

- A module can have at most one interface.
- An interface can have at most one implementation.
- A module lacking an interface reveals all its details to clients.
- An interface lacking an implementation can be seen as an assumption or an axiom.

**Typeclasses**: Typeclasses cater to more complex abstraction patterns, e.g., where an interface may have several implementations. Many other languages, ranging from Haskell to Rust, support typeclasses that are similar in spirit to what  $F^*$  also provides.

Typeclasses in F\* are actually defined mostly by a "user-space" metaprogam (relying on general support for metaprogramming in Meta-F\*), making them very flexible (e.g., multi-parameter classes, overlapping instances, etc. are easily supported).

That said, typeclasses are a relatively recent addition to the language and most of  $F^*$ 's standard library does not yet use typeclasses. As such, they are somewhat less mature than interfaces and some features require encodings (e.g., typeclass inheritance), rather than being supported with built-in syntax.

Thanks especially to Guido Martinez, who designed and implemented most of F\*'s typeclass system.

**CHAPTER** 

## **TWENTYTWO**

# **INTERFACES**

Look through the  $F^*$  standard libary (in the ulib folder) and you'll find many files with .fsti extensions. Each of these is an interface file that pairs with a module implementation in a corresponding .fst file.

An interface (.fsti) is very similar to a module implementation (.fst): it can contain all the elements that a module can, including inductive type definitions; let and let rec definitions; val declarations; etc. However, unlike module implementations, an interface is allowed to declare a symbol val f: t without any corresponding definition of f. This makes f abstract to the rest of the interface and all client modules, i.e., f is simply assumed to have type t without any definition. The definition of f is provided in the .fst file and checked to have type f, ensuring that a client module's assumption of f: t is backed by a suitable definition.

To see how interfaces work, we'll look at the design of the **bounded integer** modules FStar.UInt32, FStar.UInt64, and the like, building our own simplified versions by way of illustration.

# 22.1 Bounded Integers

The F\* primitive type int is an unbounded mathematical integer. When compiling a program to, say, OCaml, int is compiled to a "big integer", implemented by OCaml's ZArith package. However, the int type can be inefficient and in some scenarios (e.g., when compiling F\* to C) one may want to work with bounded integers that can always be represented in machine word. FStar.UInt32.t and FStar.UInt64.t are types from the standard library whose values can always be represented as 32- and 64-bit unsigned integers, respectively.

Arithmetic operations on 32-bit unsigned integers (like addition) are interpreted modulo 2^32. However, for many applications, one wants to program in a discipline that ensures that there is no unintentional arithmetic overflow, i.e., we'd like to use bounded integers for efficiency, and by proving that their operations don't overflow we can reason about bounded integer terms without using modular arithmetic.

**Note:** Although we don't discuss them here, F\*'s libraries also provide signed integer types that can be compiled to the corresponding signed integers in C. Avoiding overflow on signed integer arithmetic is not just a matter of ease of reasoning, since signed integer overflow is undefined behavior in C.

### 22.1.1 Interface: UInt32.fsti

The interface UInt32 begins like any module with the module's name. Although this could be inferred from the name of the file (UInt32.fsti, in this case), F\* requires the name to be explicit.

```
module UInt32
val t : eqtype
```

UInt32 provides one abstract type val t: eqtype, the type of our bounded integer. Its type says that it supports decidable equality, but no definition of t is revaled in the interface.

The operations on t are specified in terms of a logical model that relates t to bounded mathematical integers, in particular u32\_nat, a natural number less than pow2 32.

```
let n = 32
let min : nat = 0
let max : nat = pow2 n - 1
let u32_nat = n:nat{ n <= max }</pre>
```

**Note:** Unlike interfaces in languages like OCaml, interfaces in  $F^*$  can include let and let rec definitions. As we see in UInt32, these definitions are often useful for giving precise specifications to the other operations whose signatures appear in the interface.

To relate our abstract type t to u32\_nat, the interface provides two coercions v and u that go back and forth between t and u32\_nat. The lemma signatures vu\_inv and uv\_inv require v and u to be mutually inverse, meaning that t and u32\_nat are in 1-1 correspondence.

```
val v (x:t) : u32_nat
val u (x:u32_nat) : t

val uv_inv (x : t) : Lemma (u (v x) == x)
val vu_inv (x : u32_nat) : Lemma (v (u x) == x)
```

#### Modular addition and subtraction

Addition and subtraction on t values are defined modulo pow2 32. This is specified by the signatures of add\_mod and sub\_mod below.

```
(** Addition modulo [2^n]

Unsigned machine integers can always be added, but the postcondition is now
in terms of addition modulo [2^n] on mathematical integers *)
val add_mod (a:t) (b:t)
: y:t { v y = (v a + v b) % pow2 n }
```

```
(** Subtraction modulo [2^n]

Unsigned machine integers can always be subtracted, but the postcondition is now
in terms of subtraction modulo [2^n] on mathematical integers *)
val sub_mod (a:t) (b:t)
: y:t { v y = (v a - v b) % pow2 n }
```

#### **Bounds-checked addition and subtraction**

Although precise, the types of add\_mod and sub\_mod aren't always easy to reason with. For example, proving that add\_mod (u 2) (u 3) == u 5 requires reasoning about modular arithmetic—for constants like 2, 3, and 5 this is easy enough, but proofs about modular arithmetic over symbolic values will, in general, involve reasoning about nonlinear arithmetic, which is difficult to automate even with an SMT solver. Besides, in many safety critical software systems, one often prefers to avoid integer overflow altogether.

So, the UInt32 interface also provides two additional operations, add and sub, whose specification enables two t values to be added (resp. subtracted) only if there is no overflow (or underflow).

First, we define an auxiliary predicate fits to state when an operation does not overflow or underflow.

Then, we use fits to restrict the domain of add and sub and the type ensures that the result is the sum (resp. difference) of the arguments, without need for any modular arithmetic.

```
(** Bounds-respecting addition

The precondition enforces that the sum does not overflow,
    expressing the bound as an addition on mathematical integers *)
val add (a:t) (b:t { fits (+) a b })
    : y:t{ v y == v a + v b }
```

```
(** Bounds-respecting subtraction

The precondition enforces that the difference does not underflow,
    expressing the bound as an subtraction on mathematical integers *)
val sub (a:t) (b:t { fits (fun x y -> x - y) a b })
: y:t{ v y == v a - v b }
```

**Note:** Although the addition operator can be used as a first-class function with the notation (+), the same does not work for subtraction, since (-) resolves to unary integer negation, rather than subtraction—so, we write fun x y -> x - y.

### Comparison

Finally, the interface also provides a comparison operator 1t, as specified below:

```
(** Less than *)
val lt (a:t) (b:t)
   : r:bool { r <==> v a < v b }</pre>
```

# 22.1.2 Implementation: UInt32.fst

An implementation of UInt32 must provide definitions for all the val declarations in the UInt32 interface, starting with a representation for the abstract type t.

There are multiple possible representations for t, however the point of the interface is to isolate client modules from these implementation choices.

Perhaps the easiest implementation is to represent t as a u32\_nat itself. This makes proving the correspondence between t and its logical model almost trivial.

```
module UInt32
let t = n:nat { n <= pow2 32 - 1}
let v (x:t) = x
let u (x:u32_nat) = x
let uv_inv x = ()
let vu_inv x = ()
let add_mod a b = (a + b) % pow2 32
let sub_mod a b = (a - b) % pow2 32
let sub a b = a + b
let sub a b = a - b</pre>
let lt (a:t) (b:t) = v a < v b
```

Another choice may be to represent t as a 32-bit vector. This is a bit harder and proving that it is correct with respect to the interface requires handling some interactions between Z3's theory of bit vectors and uninterpreted functions, which we handle with a tactic. This is quite advanced, and we have yet to cover F\*'s support for tactics, but we show the code below for reference.

```
open FStar.BV
open FStar.Tactics
let t = bv_t 32
let v(x:t) = bv2int x
let u x = int2bv x
let sym (#a:Type) (x y:a)
  : Lemma (requires x == y)
          (ensures y == x)
 = ()
let dec_eq (#a:eqtype) (x y:a)
  : Lemma (requires x = y)
          (ensures x == y)
  = ()
let uv_inv (x:t)
  = assert (u (v x) == x)
        by (mapply (`sym);
            mapply (`dec_eq);
```

```
mapply (`inverse_vec_lemma))
let ty (x y:u32_nat)
  : Lemma (requires eq2 #(FStar.UInt.uint_t 32) x y)
          (ensures x == y)
  = ()
let vu_inv (x:u32_nat)
  = assert (v (u x) == x)
        by (mapply (`ty);
            mapply (`sym);
            mapply (`dec_eq);
            mapply (`inverse_num_lemma))
let add_mod a b =
  let y = bvadd #32 a b in
  assert (y == u (FStar.UInt.add_mod #32 (v a) (v b)))
     by (mapply (`sym);
         mapply (`int2bv_add);
          pointwise
              (fun _ -> try mapply (`uv_inv) with | _ -> trefl());
          trefl()):
  vu_inv ((FStar.UInt.add_mod #32 (v a) (v b)));
let sub_mod a b =
  let y = bvsub #32 a b in
  assert (y == u (FStar.UInt.sub_mod #32 (v a) (v b)))
     by
         (mapply (`sym);
          mapply (`int2bv_sub);
          pointwise
              (fun _ -> try mapply (`uv_inv) with | _ -> trefl());
          trefl());
  vu_inv ((FStar.UInt.sub_mod #32 (v a) (v b)));
  y
let add a b =
 let y = add_mod a b in
  FStar.Math.Lemmas.modulo_lemma (v a + v b) (pow2 32);
  У
let sub a b =
  let y = sub_mod a b in
  FStar.Math.Lemmas.modulo_lemma (v a - v b) (pow2 32);
  У
let lt (a:t) (b:t) = v a < v b
```

Although both implementations correctly satisfy the UInt32 interface,  $F^*$  requires the user to pick one. Unlike module systems in some other ML-like languages, where interfaces are first-class entities which many modules can implement, in  $F^*$  an interface can have at most one implementation. For interfaces with multiple implementations, one must use typeclasses.

# 22.1.3 Interleaving: A Quirk

The current F\* implementation views an interface and its implementation as two partially implemented halves of a module. When checking that an implementation is a correct implementation of an interface, F\* attempts to combine the two halves into a complete module before typechecking it. It does this by trying to *interleave* the top-level elements of the interface and implementation, preserving their relative order.

This implementation strategy is far from optimal in various ways and a relic from a time when F\*'s implementation did not support separate compilation. This implementation strategy is likely to change in the future (see this issue for details).

Meanwhile, the main thing to keep in mind when implementing interfaces is the following:

• The order of definitions in an implementation much match the order of val declarations in the interface. E.g., if the interface contains val f: tf followed by val g: tg, then the implementation of f must precede the implementation of g.

Also, remember that if you are writing val declarations in an interface, it is a good idea to be explicit about universe levels. See *here for more discussion*.

Other issues with interleaving that may help in debugging compiler errors with interfaces:

- Issue 2020
- Issue 1770
- Issue 959

# 22.1.4 Comparison with machine integers in the F\* library

F\*'s standard library includes FStar.UInt32, whose interface is similar, though more extensive than the UInt32 shown in this chapter. For example, FStar.UInt32 also includes multiplication, division, modulus, bitwise logical operations, etc.

The implementation of FStar.UInt32 chooses a representation for FStar.UInt32.t that is similar to u32\_nat, though the F\* compiler has special knowledge of this module and treats FStar.UInt32.t as a primitive type and compiles it and its operations in a platform-specific way to machine integers. The implementation of FStar.UInt32 serves only to prove that its interface is logically consistent by providing a model in terms of bounded natural numbers.

The library also provides several other unsigned machine integer types in addition to FStar.UInt32, including FStar.UInt8, FStar.UInt16, and FStar.UInt64. F\* also has several signed machine integer types.

All of these modules are very similar, but not being first-class entities in the language, there is no way to define a general interface that is instantiated by all these modules. In fact, all these variants are generated by a script from a common template.

Although interfaces are well-suited to simple patterns of information hiding and modular structure, as we'll learn next, typeclasses are more powerful and enable more generic solutions, though sometimes requiring the use of higher-order code.

**CHAPTER** 

## **TWENTYTHREE**

# **TYPECLASSES**

Consider writing a program using bounded unsigned integers while being generic in the actual bounded integer type, E.g., a function that sums a list of bounded integers while checking for overflow, applicable to both UInt32 and UInt64. Since F\*'s interfaces are not first-class, one can't easily write a program that abstracts over those interfaces. Typeclasses can help.

Some background reading on typeclasses:

- Phil Wadler and Stephen Blott introduced the idea in 1989 in a paper titled "How to make ad hoc polymorphism less ad hoc." Their work, with many extensions over the years, is the basis of Haskell's typeclasses.
- A tutorial on typeclasses in the Coq proof assistant is available here.
- Typeclasses are used heavily in the Lean proof assistant to structure its math library.

# 23.1 Printable

A typeclass associates a set of *methods* to a tuple of types, corresponding to the operations that can be performed using those types.

For instance, some types may support an operation that enables them to be printed as strings. A typeclass printable (a:Type) represent the class of all types that support a to\_string: a -> string operation.

```
class printable (a:Type) =
{
  to_string : a -> string
}
```

The keyword class introduces a new typeclass, defined as a *record type* with each method represented as a field of the record.

To define instances of a typeclass, one uses the instance keyword, as shown below.

```
instance printable_bool : printable bool =
{
  to_string = Prims.string_of_bool
}
instance printable_int : printable int =
{
  to_string = Prims.string_of_int
}
```

The notation instance printable\_bool: printable bool = e states that the value e is a record value of type printable bool, and just as with a let-binding, the term e is bound to the top-level name printable\_bool.

The convenience of typeclasses is that having defined a class, the typeclass method is automatically overloaded for all instances of the class, and the type inference algorithm finds the suitable instance to use. This is the original motivation of typeclasses—to provide a principled approach to operator overloading.

For instance, we can now write printb and printi and use to\_string to print both booleans and integers, since we shown that they are instances of the class printable.

```
let printb (x:bool) = to_string x
let printi (x:int) = to_string x
```

Instances need not be only for base types. For example, all lists are printable so long as their elements are, and this is captured by what follows.

```
instance printable_list (#a:Type) (x:printable a) : printable (list a) =
{
  to_string = (fun 1 -> "[" ^ FStar.String.concat "; " (List.Tot.map to_string l) ^ "]")
}
```

That is, printable\_list constructs a to\_string method of type list a -> string by mapping the to\_string method of the printable a instance over the list. And now we can use to\_string with lists of booleans and integers too.

```
let printis (l:list int) = to_string l
let printbs (l:list bool) = to_string l
```

There's nothing particularly specific about the ground instances printable bool and printable int. It's possible to write programs that are polymorphic in printable types. For example, here's a function print\_any\_list that is explicitly parameterized by a printable a—one can call it by passing in the instance that one wishes to use explicitly:

```
let print_any_list_explicit #a ( _ : printable a ) (1:list a) = to_string l
let _ = print_any_list_explicit printable_int [1;2;3]
```

However, we can do better and have the compiler figure out which instance we intend to use by using a bit of special syntax for a typeclass parameter, as shown below.

```
let print_any_list #a {| _ : printable a |} (1:list a) = to_string l
let _ex1 = print_any_list [[1;2;3]]
let _ex2 = print_any_list #_ #(printable_list printable_int) [[1;2;3]]
```

The parameter {| \_ : printable a |} indicates an implicit argument that, at each call site, is to be computed by the compiler by finding a suitable typeclass instance derivable from the instances in scope. In the first example above, F\* figures out that the instance needed is printable\_list printable\_int : printable (list int). Note, you can always pass the typeclass instance you want explicitly, if you really want to, as the second example \_ex2 above shows.

In many cases, the implicit typeclass argument need not be named, in which case one can just omit the name and write:

```
let print_any_list_alt #a {| printable a |} (1:list a) = to_string 1
```

#### 23.1.1 Under the hood

When defining a class, F\* automatically generates generic functions corresponding to the methods of the class. For instance, in the case of printable, F\* generates:

```
let to_string #a {| i : printable a |} (x:a) = i.to_string x
```

Having this in scope overloads to\_string for all instance of the printable class. In the implementation of to\_string, we use the instance i (just a record, sometimes called a dictionary in the typeclass literature) and project its to\_string field and apply it to x.

Defining an instance  $p \ x1..xn$ : t = e is just like an ordinary let binding let  $p \ x1..xn$ : t = e, however the instance keyword instructs  $F^*$ 's type inference algorithm to consider using p when trying to instantiate implicit arguments for typeclass instances.

For example, at the call site to\_string (x:bool), having unified the implicit type arguments a with bool, what remains is to find an instance of printable bool. F\* looks through the current context for all variable bindings in the local scope, and instance declarations in the top-level scope, for a instance of printable bool, taking the first one it is able to construct.

The resolution procedure for to\_string [[1;2;3]] is a bit more interesting, since we need to find an instance printable (list int), although no such ground instance exists. However, the typeclass resolution procedure finds the printable\_list instance function, whose result type printable (list a) matches the goal printable (list int), provided a = int. The resolution procedure then spawns a sub-goal printable int, which it solves easily and completes the derivation of printable (list int).

This backwards, goal-directed search for typeclass resolution is a kind of logic programming. An interesting implementation detail is that most of the typeclass machinery is defined as a metaprogran in FStar.Tactics.Typeclasses, outside of the core of  $F^*$ 's compiler. As such, the behavior of typeclass resolution is entirely user-customizable, simply by revising the metaprogram in use. Some details about how this works can be found in a paper on Meta  $F^*$ .

#### 23.1.2 Exercises

Define instances of printable for string, a & b, option a, and either a b. Check that you can write to\_string [Inl (0, 1); Inr (Inl (Some true)); Inr (Inr "hello") ] and have F\* infer the typeclass instance needed.

Also write the typeclass instances you need explicitly, just to check that you understand how things work. This is exercise should also convey that typeclasses do not increase the expressive power in any way—whatever is expressible with typeclasses, is also expressible by explicitly passing records that contain the operations needed on specific type parameters. However, expliciting passing this operations can quickly become overwhelming—typeclass inference keeps this complexity in check and makes it possible to build programs in an generic, abstract style without too much pain.

This exercise file provides the definitions you need.

#### Answer

```
instance printable_string : printable string =
{
  to_string = fun x -> "\"" ^ x ^ "\""
}
instance printable_pair #a #b {| printable a |} {| printable b |} : printable (a & b) =
{
  to_string = (fun (x, y) -> "(" ^ to_string x ^ ", " ^ to_string y ^ ")")
}

(continues on next page)
```

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```
instance printable_option #a {| printable a |} : printable (option a) =
  to_string = (function None -> "None" | Some x -> "(Some " ^ to_string x ^ ")")
}
instance printable_either #a #b {| printable a |} {| printable b |} : printable (either_
\rightarrowa b) =
  to_string = (function Inl x -> "(Inl " ^ to_string x ^ ")" | Inr x -> "(Inr " ^ to_

string x ^ ")")
let _ = to_string [Inl (0, 1); Inr (Inl (Some true)); Inr (Inr "hello") ]
//You can always pass the typeclass instance you want explicitly, if you really want to
//typeclass resolution really saves you from LOT of typing!
let _ = to_string #_
             #(printable_list
                (printable_either #_ #_ #(printable_pair #_ #_ #printable_int #printable_
⇒int)
                                         #(printable_either #_ #_ #(printable_option #_
→#printable_bool)
                                                                  #(printable_string))))
             [Inl (0, 1); Inr (Inl (Some true)); Inr (Inr "hello")]
```

## 23.2 Bounded Unsigned Integers

The printable typeclass is fairly standard and can be defined in almost any language that supports typeclasses. We now turn to a typeclass that leverages F\*'s dependent types by generalizing the interface of bounded unsigned integers that we developed in a *previous chapter*.

A type a is in the class bounded\_unsigned\_int, when it admits:

- An element bound : a, representing the maximum value
- A pair of functions from\_nat and to\_nat that form a bijection between a and natural numbers less than to\_nat bound

This is captured by the class below:

(continues on next page)

```
}
```

**Note:** The attribute FStar.Tactics.Typeclasses.no\_method on the properties field instructs F\* to not generate a typeclass method for this field. This is useful here, since we don't really want to overload the name properties as an operator over all instances bound the class. It's often convenient to simply open FStar.Tactics.Typeclasses when using typeclasses, or to use a module abbreviation like module TC = FStar.Tactics.Typeclasses so that you don't have to use a fully qualified name for no\_method.

For all bounded\_unsigned\_ints, one can define a generic fits predicate, corresponding to the bounds check condition that we introduced in the UInt32 interface.

Likewise, the predicate related\_ops defines when an operation bop on bounded integers is equivalent to an operation iop on mathematical integers.

## 23.2.1 Typeclass Inheritance

Our bounded\_unsigned\_int a class just showed that a is in a bijection with natural numbers below some bound. Now, we can define a separate class, extending bounded\_unsigned\_int with the operations we want, like addition, subtraction, etc.

```
class bounded_unsigned_int_ops (a:Type) = {
   [@@@TC.no_method]
   base
              : bounded_unsigned_int a;
   add
              : (x:a -> y:a \{ fits (+) x y \} -> a);
              : (x:a -> y:a { fits op_Subtraction x y } -> a);
   suh
              : (a -> a -> bool);
   [@@@TC.no_method]
  properties : squash (
     related_ops ( + ) add /\
     related_ops op_Subtraction sub /\
     (forall (x y:a). lt x y \ll as_nat x \ll as_nat y) // It is related to \ll
     (forall (x:a). fits op_Subtraction bound x) //subtracting from the maximum element.
→never triggers underflow
  )
}
```

The class above makes use of *typeclass inheritance*. The base field stores an instance of the base class bounded\_unsigned\_int, while the remaining fields extend it with:

- add: a bounded addition operation
- · sub: a bounded subtraction operation
- lt: a comparison function
- properties, which show that
  - add is related to integer addition +
  - sub is related to integer subtraction -
  - 1t is related to <
  - and that sub bound x is always safe

Typeclass inheritance in the form of additional fields like base is completely flexible, e.g., multiple inheritance is permissible (though, as we'll see below, should be used with care, to prevent surprises).

Treating an instance of a class as an instance of one its base classes is easily coded as instance-generating function. The code below says that an instance from bounded\_unsigned\_int a can be derived from an instance of d: bounded\_unsigned\_int\_ops a just by projecting its base field.

```
instance ops_base #a {| d : bounded_unsigned_int_ops a |}
    : bounded_unsigned_int a
    = d.base
```

## 23.2.2 Infix Operators

F\* does not allows the fields of a record to be named using infix operator symbols. This will likely change in the future. For now, to use custom operations with infix notation for typeclass methods, one has to define them by hand:

#### 23.2.3 Derived Instances

We've already seen how typeclass inheritance allows a class to induce an instance of its base class(es). However, not all derived instances are due to explicit inheritance—some instances can be *computed* from others.

For example, here's a class eq for types that support decidable equality.

```
class eq (a:Type) = {
  eq_op: a -> a -> bool;

  [@@@TC.no_method]
  properties : squash (
    forall x y. eq_op x y <==> x == y
  )
}
let ( =?= ) #a {| eq a |} (x y: a) = eq_op x y
```

We'll write x = ?= y for an equality comparison method from this class, to not confuse it with  $F^*$ 's built-in decidable equality (=) on eqtype.

Now, from an instance of bounded\_unsigned\_int\_ops a we can compute an instance of eq a, since we have <^, a strict comparison operator that we know is equivalent to < on natural numbers.  $F^*$ , from all the properties we have on bounded\_unsigned\_int\_ops and its base class bounded\_unsigned\_int, can automatically prove that not (x <^ y) && not (y <^ x) is valid if and only if x == y. This instance of eq now also lets us easily implement a non-strict comparison operation on bounded unsigned ints.

```
instance bounded_unsigned_int_ops_eq #a {| bounded_unsigned_int_ops a |}
: eq a
= {
    eq_op = (fun x y -> not (x <^ y) && not (y <^ x));
    properties = ()
}
let ( <=^ ) #a {| bounded_unsigned_int_ops a |} (x y : a)
: bool
= x <^ y || x =?= y</pre>
```

#### 23.2.4 Ground Instances

We can easily provide ground instances of bounded\_unsigned\_int\_ops for all the F\* bounded unsigned int types—we show instances for FStar.UInt32.t and FStar.UInt64.t, where the proof of all the properties needed to construct the instances is automated.

```
module U32 = FStar.UInt32
module U64 = FStar.UInt64
instance u32_instance_base : bounded_unsigned_int U32.t =
  let open U32 in
  {
    bound = 0xffffffffful;
    as_nat = v;
    from_nat = uint_to_t;
    properties = ()
```

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```
}
instance u32_instance_ops : bounded_unsigned_int_ops U32.t =
  let open U32 in
     base = u32_instance_base;
     add = (\mathbf{fun} \times \mathbf{y} \rightarrow \mathbf{add} \times \mathbf{y});
     sub = (fun x y -> sub x y);
     lt = (\mathbf{fun} \times \mathbf{y} -> lt \times \mathbf{y});
     properties = ()
  }
instance u64_instance_base : bounded_unsigned_int U64.t =
  let open U64 in
     bound
                = 0xffffffffffffftuL;
     as_nat
              = v;
     from_nat = uint_to_t;
     properties = ()
}
instance u64_instance_ops : bounded_unsigned_int_ops U64.t =
  let open U64 in
     base = u64_instance_base;
     add = (\mathbf{fun} \times \mathbf{y} \rightarrow \mathbf{add} \times \mathbf{y});
     sub = (fun x y -> sub x y);
     lt = (\mathbf{fun} \times \mathbf{y} -> lt \times \mathbf{y});
     properties = ()
  }
```

And one can check that typeclass resolution works well on those ground instances.

Finally, as promised at the start, we can write functions that are generic over all bounded unsigned integers, something we couldn't do with interfaces alone.

```
(l:list a) (acc:a)
: option a
= L.fold_right
    (fun (x:a) (acc:option a) ->
        match acc with
    | None -> None
    | Some y ->
        if x <=^ bound -^ y
        then Some (x +^ y)
        else None)
    l
    (Some acc)

let testsum32 : U32.t = Some?.v (sum [0x01ul; 0x02ul; 0x03ul] 0x00ul)
let testsum64 : U64.t = Some?.v (sum [0x01uL; 0x02uL; 0x03uL] 0x00uL)</pre>
```

 $F^*$  can prove that the bounds check in sum is sufficient to prove that the addition does not overflow, and further, that the two tests return Some  $\_$  without failing due to overflow.

However, the proving that Some? (sum [0x01ul; 0x02ul; 0x03ul] 0x00ul) using the SMT solver alone can be expensive, since it requires repeated unfolding of the recursive function sum—such proofs are often more easily done using F\*'s normalizer, as shown below—we saw the assert\_norm construct in a previous section.

**Note:** That said, by using dependently typed generic programming (which we saw a bit of *earlier*), it is possible to write programs that abstract over all machine integer types without using typeclasses. The F\* library FStar. Integers shows how that works. Though, the typeclass approach shown here is more broadly applicable and extensible.

## 23.3 Dealing with Diamonds

One may be tempted to factor our bounded\_unsigned\_int\_ops typeclass further, separating out each operation into a separate class. After all, it may be the case that some instances of bounded\_unsigned\_int types support only addition while others support only subtraction. However, when designing typeclass hierarchies one needs to be careful to not introduce coherence problems that result from various forms of multiple inheritance.

Here's a typeclass that captures only the subtraction operation, inheriting from a base class.

```
sub : (x:a -> y:a { fits op_Subtraction x y } -> a);

[@@@no_method]
properties : squash (
    related_ops op_Subtraction sub /\
    (forall (x:a). fits op_Subtraction bound x)
)
}

instance subtractable_base {| d : subtractable_bounded_unsigned_int 'a |}
: bounded_unsigned_int 'a
= d.base
```

And here's another typeclass that provides only the comparison operation, also inheriting from the base class.

```
class comparable_bounded_unsigned_int (a:Type) = {
    [@@@no_method]
    base : bounded_unsigned_int a;
    comp : a -> a -> bool;

    [@@@no_method]
    properties : squash (
        (forall (x y:a).{:pattern comp x y} comp x y <==> as_nat x < as_nat y)
    )
}

instance comparable_base {| d : comparable_bounded_unsigned_int 'a |}
    : bounded_unsigned_int 'a
    = d.base</pre>
```

However, now when writing programs that expect both subtractable and comparable integers, we end up with a coherence problem.

The sub operation fails to verify, with  $F^*$  complaining that it cannot prove fits op\_Subtraction bound acc, i.e., this sub may underflow.

At first, one may be surprised, since the s: subtractable\_bounded\_unsigned\_int a instance tells us that subtracting from the bound is always safe. However, the term bound is an overloaded (nullary) operator and there are two ways to resolve it: s.base.bound or c.base.bound and these two choices are not equivalent. In particular, from s: subtractable\_bounded\_unsigned\_int a, we only know that s.base.bound `sub` acc is safe, not that c.base.bound `sub` acc is safe.

Slicing type typeclass hierarchy too finely can lead to such coherence problems that can be hard to diagnose. It's better to avoid them by construction, if at all possible. Alternatively, if such problems do arise, one can sometimes add additional preconditions to ensure that the multiple choices are actually equivalent. There are many ways to do this, ranging from indexing typeclasses by their base classes, to adding equality hypotheses—the equality hypothesis below is sufficient.

## 23.4 Overloading Monadic Syntax

We now look at some examples of typeclasses for *type functions*, in particular, typeclasses for functors and monads.

**Note:** If you're not familiar with monads, referring back to A First Model of Computational Effects may help.

In *a previous chapter*, we introduced syntactic sugar for monadic computations. In particular, F\*'s syntax supports the following:

- Instead of writing bind f (fun x -> e) you can define a custom let!-operator and write let! x = f in e.
- And, instead of writing bind f (fun \_ -> e) you can write f ;! e.

Now, if we can overload the symbol bind to work with any monad, then the syntactic sugar described above would work for all of them. This is accomplished as follows.

We define a typeclass monad, with two methods return and ( let! ).

```
class monad (m:Type -> Type) =
{
   return : (#a:Type -> a -> m a);
   ( let! ) : (#a:Type -> #b:Type -> (f:m a) -> (g:(a -> m b)) -> m b);
}
```

Doing so introduces return and ( let! ) into scope at the following types:

```
let return #m {| d : monad m |} #a (x:a) : m a = d.return x
let ( let! ) #m {| d : monad m |} #a #b (f:m a) (g: a -> m b) : m b = d.bind f g
```

That is, we now have ( let! ) in scope at a type general enough to use with any monad instance.

**Note:** There is nothing specific about let!; F\* allows you to add a suffix of operator characters to the let-token. See this file for more examples of monadic let operators

The type st s is a state monad parameterized by the state s, and st s is an instance of a monad.

With some basic actions get and put to read and write the state, we can implement st computations with a syntax similar to normal, direct-style code.

```
let get #s
    : st s s
    = fun s -> s, s

let put #s (x:s)
    : st s unit
    = fun _ -> (), x

let get_inc =
    let! x = get in
    return (x + 1)
```

Of course, we can also do proofs about our st computations: here's a simple proof that get\_put is noop.

```
let get_put #s =
  let! x = get #s in
  put x

let noop #s : st s unit = return ()

let get_put_identity (s:Type)
  : Lemma (get_put #s `FStar.FunctionalExtensionality.feq` noop #s)
  = ()
```

Now, the nice thing is that since ( let! ) is monad polymorphic, we can define other monad instances and still use the syntactic sugar to build computations in those monads. Here's an example with the option monad, for computations that may fail.

### 23.4.1 Exercise

```
Define a typeclass for functors, type functions m: Type -> Type which support the operations fmap : (a -> b) -> m a -> m b.
```

Build instances of functor for a few basic types, e.g., list.

Derive an instance for functors from a monad, i.e., prove

```
instance monad_functor #m {| monad m |} : functor m = admit()
```

This file provides the definitions you need.

#### **Answer**

## 23.5 Beyond Monads with Let Operators

Many monad-like structures have been proposed to structure effectful computations. Each of these structures can be captured as a typeclass and used with  $F^*$ 's syntactic sugar for let operators.

As an example, we look at *graded monads*, a construction studied by Shin-Ya Katsumata and others, in several papers. This example illustrates the flexibility of typeclasses, including typeclasses for types that themselves are indexed by other typeclasses.

The main idea of a graded monad is to index a monad with a monoid, where the monoid index characterizes some property of interest of the monadic computation.

A monoid is a typeclass for an algebraic structure with a single associative binary operation and a unit element for that operation. A simple instance of a monoid is the natural numbers with addition and the unit being 0.

```
class monoid (a:Type) =
{
    op : a -> a -> a;
    one : a;
    properties: squash (
        (forall (x:a). op one x == x /\ op x one == x) /\
            (forall (x y z:a). op x (op y z) == op (op x y) z)
    );
}
instance monoid_nat_plus : monoid nat =
{
    op = (fun (x y:nat) -> x + y);
    one = 0;
    properties = ()
}
```

A graded monad is a type constructor m indexed by a monoid as described by the class below. In other words, m is equipped with two operations:

- a return, similar to the return of a monad, but whose index is the unit element of the monoid
- a ( let+ ), similar to the ( let! ) of a monad, but whose action on the indexes corresponds to the binary operator of the indexing monoid.

With this class, we have overloaded ( let+ ) to work with all graded monads. For instance, here's a graded state monad, count\_st whose index counts the number of put operations.

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```
let y, s', m = g x s in
    y, s', op #nat n m

instance count_st_graded (s:Type) : graded_monad (count_st s) =
{
  return = count_return #s;
  ( let+ ) = count_bind #s;
}

// A write-counting grade monad
let get #s : count_st s 0 s = fun s -> s, s, 0
let put #s (x:s) : count_st s 1 unit = fun _ -> (), x, 1
```

We can build computations in our graded count\_st monad relatively easily.

```
let test #s =
  let+ x = get #s in
  put x

//F* + SMT automatically proves that the index simplifies to 2
let test2 #s : count_st s 2 unit =
  let+ x = get in
  put x ;+
  put x
```

F\* infers the typeclass instantiations and the type of test to be count\_st s (op #monoid\_nat\_plus 0 1) unit.

In test2, F\* infers the type count\_st s (op #monoid\_nat\_plus 0 (op #monoid\_nat\_plus 1 1)) unit, and then automatically proves that this type is equivalent to the user annotation count\_st s 2 unit, using the definition of monoid\_nat\_plus. Note, when one defines let+, one can also use e1 ;+ e2 to sequence computations when the result type of e1 is unit.

## 23.6 Summary

Typeclasses are a flexible way to structure programs in an abstract and generic style. Not only can this make program construction more modular, it can also make proofs and reasoning more abstract, particularly when typeclasses contain not just methods but also properties characterizing how those methods ought to behave. Reasoning abstractly can make proofs simpler: for example, if the monoid-ness of natural number addition is the only property needed for a proof, it may be simpler to do a proof generically for all monoids, rather than reasoning specifically about integer arithmetic.

That latter part of this chapter presented typeclasses for computational structures like monads and functors. Perhaps conspicuous in these examples were the lack of algebraic laws that characterize these structures. Indeed, we focused primarily on programming with monads and graded monads, rather than reasoning about them. Enhancing these typeclasses with algebraic laws is a useful, if challenging exercise. This also leads naturally to F\*'s effect system in the next section of this book, which is specifically concerned with doing proofs about programs built using monad-like structures.

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# Part V Computational Effects

All the programs we've considered so far have been *pure*, which is to say that only thing that can be observed about a program by its context is the value that the program returns—the inner workings of the program (e.g., whether it multiplies two numbers by repeated addition or by using a primitive operation for multiplication) cannot influence the behavior of its context. That is, pure terms can be reasoned about like pure mathematical functions.<sup>1</sup>

However, many practical programs exhibit behaviors that are beyond just their output. For example, they may mutate some global state, or they may read and write files, or receive or send messages over the network—such behaviors are often called *side effects*, *computational effects*, or just *effects*.

In this section, we look at F\*'s effect system which allows users to

- Model the semantics of various kinds of effects, e.g., mutable state, input/output, concurrency, etc.
- Develop reasoning principles that enable building proofs of various properties of effectful programs
- Simplify effectful program construction by encapsulating the semantic model and reasoning principles within an abstraction that allows users to write programs in F\*'s native syntax while behind the scenes, for reasoning and execution purposes, programs are elaborated into the semantic model

Aside from user-defined effects, F\*'s also supports the following *primitive* effects:

- **Ghost**: An effect which describes which parts of a program have no observable behavior at all, and do not even influence the result returned by the program. This allows optimizing a program by erasing the parts of a program that are computationally irrelevant.
- **Divergence**: An effect that encapsulates computations which may run forever. Potentially divergent computations cannot be used as proofs (see *termination*) and the effect system ensures that this is so.
- **Partiality**: Partial functions are only defined over a subset of their domain. F\* provides primitive support for partial functions as an effect. Although currently primitive, in the future, we hope to remove the special status of partial functions and make partial functions a user-defined notion too.

 $<sup>^1</sup>$  Although pure F\* programs are mathematical functions in the ideal sense, when executing these programs on a computer, they do exhibit various side effects, including consuming resources like time, power, and memory. Although these side effects are clearly observable to an external observer of a running F\* program, the resourse-usage side effects of one component of a pure F\* program are not visible to another component of the same program.

## COMPUTATION TYPES TO TRACK DEPENDENCES

A main goal for F\*'s effect system is to *track dependences* among the various parts of a program. For example, the effect system needs to ensures that the total part of a program that is proven to always terminate never calls a function in the divergent fragment (since that function call may loop forever). Or, that the runtime behavior of a compiled program does not depend on ghost computations that get erased by the compiler.

In a paper from 1999 called A Core Calculus of Dependency, Abadi et al. present DCC, a language with a very generic way to track dependences. DCC's type system includes an indexed, monadic type  $T_l$ , where the index l ranges over the elements of a lattice, i.e., the indexes are arranged in a partial order. DCC's type system ensures that a computation with type  $T_l$  can depend on another computation with type  $T_m$  only if  $m \leq l$  in the lattice's partial order. F\*'s effect system is inspired by DCC, and builds on a 2011 paper by Swamy et al. called Lightweight Monadic Programming in ML which develops a DCC-like system for an ML-like programming language.

At its core, F\*'s effect system includes the following three elements:

**Computation Types:** F\*'s type system includes a notion of *computation type*, a type of the form M t where M is an *effect label* and t is the return type of the computation. A term e can be given the computation type M t when executing e exhibits *at-most* the effect M and (possibly) returns a value of type t. We will refine this intuition as we go along. In contrast with computation types, the types that we have seen so far (unit, bool, int, list int, other inductive types, refinement types, and arrows) are called *value types*.

**Partially Ordered Effect Labels**: The effect label of a computation type is drawn from an open-ended, user-extensible set of labels, where the labels are organized in a user-chosen partial order. For example, under certain conditions, one can define the label M to be a sub-effect of M, i.e., M < M. For any pair of labels M and M, a partial function lub M M (for least upper bound) computes the least label greater than both M and M, if any.

**Typing Rules to Track Dependences**: The key part of the effect system is a rule for composing computations sequentially using let x = e1 in e2. Suppose e1: M t1, and suppose e2: N t2 assuming x:t1, then the composition let x = e1 in e2 has type L t2, where L = lub M N—if lub M N is not defined, then the let-binding is rejected. Further, a computation with type M t can be implicitly given the type N t, when M < N, i.e., moving up the effect hierarchy is always permitted. The resulting typing discipline enforces the same dependence-tracking property as DCC: a computation M t can only depend on N t when lub M N = M.

In full generality,  $F^*$ 's computation types are more complex than just an effect label M and a result type (i.e., more than just M t), and relying on  $F^*$ 's dependent types, computation types do more than just track dependences, e.g., a computation type in  $F^*$  can also provide full, functional correctness specifications. The papers referenced below provide some context and we discuss various elements of these papers throughout this part of the book.

- Verifying Higher-order Programs with the Dijkstra Monad, introduces the idea of a Dijkstra monad, a construction to structure the inference of weakest preconditions of effectful computations.
- This 2016 paper, Dependent Types and Multi-Monadic Effects in F\*, has become the canonical reference for F\*. It shows how to combine multiple Dijkstra monads with a DCC-like system.
- Dijkstra Monads for Free presents an algorithm to construct Dijkstra monads automatically for a class of simple monads.

- Dijkstra Monads for All generalizes the construction to apply to relate any computational monad to a specificational counterpart, so long as the two are related by a monad morphism.
- Programming and Proving with Indexed Effects describes F\*'s user-defined effect system in its most general form, allowing it to be applied to any indexed effects, including Dijkstra monads, but several other constructions as well.

**CHAPTER** 

### **TWENTYFIVE**

## THE EFFECT OF TOTAL COMPUTATIONS

At the very bottom of the effect label hierarchy is Tot, used to describe pure, total functions. Since they are at the bottom of the hierarchy, Tot computations can only depend on other Tot computations, ensuring that F\*'s logical core remains total.

Every term in F\* is typechecked to have a computation type. This includes the total terms we have been working with. Such terms are classified in the default effect called Tot, the effect of total computations that do not have any observable effect, aside from the value they return. Any meaning or intuition that we have ascribed to typing e:t extends to e:Tot t. For example, if e:Tot t, then at runtime, e terminates and produces a value of type t. In addition, since its effect label is Tot, it has no side-effect.

In fact, as we have already *seen*, notationally  $x:t0 \to t1$  is a shorthand for  $x:t0 \to t1$  (where t1 could itself be an arrow type). More generally, arrow types in  $F^*$  take the form  $x:t \to C$ , representing a function with argument type t0 and body computation type C (which may depend on x).

Similarly, the return type annotation that we have seen in the let definitions is also a shorthand, e.g., the id function

```
let id (a:Type) (x:a) : a = x
```

is a shorthand for

```
let id (a:Type) (x:a) : Tot a = x //the return type annotation is a computation type
```

and the type of id is a:Type -> a -> Tot a. More generally, the return type annotations on let definitions are computation types C.

The explicit annotation syntax e <: t behaves a little differently.  $F^*$  allows writing e <: C, and checks that e indeed has computation type C. But when the effect label is omitted, e <: t, it is interpreted as e <: t, where the omitted effect label is inferred by  $F^*$  and does not default to Tot.

### 25.1 Evaluation order

For pure functions, the evaluation order is irrelevant.  $^1$  F\* provides abstract machines to interpret pure terms using either a lazy evaluation strategy or a call-by-value strategy (see a *forthcoming chapter on F\*'s normalizers*). Further, compiling pure programs to OCaml, F\* inherits the OCaml's call-by-value semantics for pure terms.

When evaluating function calls with effectful arguments, the arguments are reduced to values first, exhibiting their effects, if any, prior to the function call. That is, where e1 and e2 may be effectful, the application e1 e2 is analogous to bind f = e1 in bind f = e2 in f f in fact, internally this is what f elaborates e1 e2 to, when either of

<sup>&</sup>lt;sup>1</sup> Since F\* is an extensional type theory, pure F\* terms are only *weakly* normalizing. That is, some evaluation strategies (e.g., repeatedly reducing a recursive function deep in an infeasible code path) need not terminate. However, for every closed, pure term, there is a reduction strategy that will reduce it fully. As such, the evaluation order for pure functions is irrelevant, except that some choices of evaluation order may lead to non-termination.

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them may have non-trivial effects. As such, for effectful terms,  $F^*$  enforces a left-to-right, call-by-value semantics for effectful terms.

Since only the value returned by a computation is passed as an argument to a function, function argument types in  $F^*$  are always value types. That is, they always have the form  $t \to C$ . To pass a computation as an argument to another function, you must encapsulate the computation in a function, e.g., in place of  $C \to C$ , one can write (unit  $\to C$ )  $\to C'$ . Since functions are first-class values in  $F^*$ , including functions whose body may have non-trivial effects, one can always do this.

**CHAPTER** 

## **TWENTYSIX**

## **ERASURE AND THE GHOST EFFECT**

When writing proof-oriented programs, inevitably, some parts of the program serve only to state and prove properties about the code that actually executes. Our first non-trivial effect separates the computationally relevant parts of the program from the computationally irrelevant (i.e., specificational or *ghost*) parts of a program. This separation enables the F\* compiler to guarantee that all the ghost parts of a program are optimized away entirely.

For a glimpse of what all of this is about, let's take a look again at length-indexed vectors—we saw them first here.

```
type vec (a:Type) : nat -> Type =
   | Nil : vec a 0
   | Cons : #n:nat -> hd:a -> tl:vec a n -> vec a (n + 1)
```

and a function to concatenate two vectors:

Compare this with concatenating two lists:

```
let rec list_append #a (l1 l2:list a) =
    match l1 with
    | [] -> []
    | hd::tl -> hd :: list_append tl l2
```

Superficially, because of the implicit arguments, it may look like concatenating vectors with append is just as efficient as a concatenating lists—the length indexes seem to impose no overhead. But, let's look at the code that  $F^*$  extracts to OCaml for length-indexed vectors.

First, in the definition of the vec type, since OCaml is not dependently typed, the nat-index of the F\* vec is replaced by a 'dummy type argument—that's fine. But, notice that the Cons constructor contains three fields: a Prims.nat for the length of the tail of the list, the head of the list, and then then tail, i.e., the length of the tail of the list is stored at every Cons cell, so the vec type is actually less space efficient than an ordinary list.

```
type ('a, 'dummy) vec =
   | Nil
   | Cons of Prims.nat * 'a * ('a, unit) vec
```

Next, in the OCaml definition of append, we see that it receives additional arguments n and m for the lengths of the vectors, and worse, in the last case, it incurs an addition to sum n' + m when building the result vector. So, append is also less time-efficient than List.append.

This is particularly unfortunate, since the computational behavior of append doesn't actually depend on the length indexes of the input vectors. What we need is a principled way to indicate to the F\* compiler that some parts of a computation are actually only there for specification or proof purposes and that they can be removed when compiling the code, without changing the observable result computed by the program. This is what *erasure* is about—removing the computationally irrelevant parts of a term for compilation.

Here's a revised version of vectors, making use of the erased type from the FStar.Ghost library to indicate to F\* which parts must be erased by the compiler.

```
module VecErased
open FStar.Ghost

noeq
type vec a : nat -> Type =
    | Nil : vec a 0
    | Cons : #n:erased nat -> hd:a -> tl:vec a n -> vec a (n + 1)

let rec append #a (#n #m:erased nat) (v0:vec a n) (v1:vec a m)
    : vec a (n + m)
    = match v0 with
    | Nil -> v1
    | Cons hd tl -> Cons hd (append tl v1)
```

We'll look into this in much more detail in what follows, but notice for now that:

- 1. The first argument of Cons now has type erased nat.
- 2. The implicit arguments of append corresponding to the indexes of the input vectors have type erased nat.

If we extract this code to OCaml, here's what we get:

```
type ('a, 'dummy) vec =
    | Nil
    | Cons of unit * 'a * ('a, unit) vec
```

```
let rec append :
    'a . unit -> unit -> ('a, unit) vec -> ('a, unit) vec -> ('a, unit) vec =
    fun n ->
        fun w0 ->
        fun v1 ->
```

(continues on next page)

```
match v0 with
| Nil -> v1
| Cons (uu___, hd, tl) -> Cons ((), hd, (append () () tl v1))
```

Notice that the erased arguments have all been turned into the unit value (), and the needless addition in append is gone too.

Of course, the code would be cleaner if  $F^*$  were to have entirely removed the argument instead of leaving behind a unit term, but we leave it to the downstream compiler, e.g., OCaml itself, to remove these needless units. Further, if we're compiling the ML code extracted from  $F^*$  to C, then KaRaMeL does remove these additional units in the C code it produces.

## 26.1 Ghost: A Primitive Effect

The second, primitive effect in  $F^*$ 's effect system is the effect of *ghost* computations, i.e., computation types whose effect label is  $\mathsf{GTot}$ . The label  $\mathsf{GTot}$  is strictly above  $\mathsf{Tot}$  in the effect hierarchy, i.e.,  $\mathsf{Tot} < \mathsf{GTot}$ . This means that a term with computation type  $\mathsf{GTot}$  t cannot influence the behavior of a term whose type is  $\mathsf{Tot}$  s. Conversely, every  $\mathsf{Tot}$  computation can be implicitly promoted to a  $\mathsf{GTot}$  computation.

Ghost computations are just as well-behaved as pure, total terms—they always terminate on all inputs and exhibit no observable effects, except for the value they return. As such, F\*'s logical core really includes both Tot and GTot computations. The distinction between Tot and GTot is only relevant when considering how programs are compiled. Ghost computations are guaranteed to be erased by the the compiler, while Tot computations are retained.

Since Tot terms are implicitly promoted to GTot, it is easy to designate that some piece of code should be erased just by annotating it with a GTot effect label. For example, here is an ghost version of the factorial function:

```
let rec factorial (n:nat)
  : GTot nat
  = if n = 0 then 1 else n * factorial (n - 1)
```

Its definition is identical to the corresponding total function that we saw earlier, except that we have annotated the return computation type of the function as GTot nat. This indicates to F\* that factorial is to be erased during compilation, and the F\* type-and-effect checker ensures that Tot computation cannot depend on an application of factorial n.

# 26.2 Ghost Computations as Specifications

A ghost function like factorial can be used in specifications, e.g., in a proof that a tail recursion optimization factorial\_tail is equivalent to factorial.

```
let rec factorial_tail (n:nat) (out:nat)
  : Tot (r:nat { r == out * factorial n })
  = if n = 0 then out
    else factorial_tail (n - 1) (n * out)

let fact (n:nat)
  : Tot (r:nat { r == factorial n })
  = factorial_tail n 1
```

<sup>&</sup>lt;sup>1</sup> The name GTot is meant to stand for "Ghost and Total" computations, and is pronounced "gee tote". However, it's a poor name and is far from self-explanatory. We plan to change the name of this effect in the future (e.g., to something like Spec, Ghost, or Erased), though this is a breaking change to a large amount of existing F\* code.

This type allows a client to use the more efficient fact, but for reasoning purposes, one can use the more canonical factorial, proven equivalent to fact.

In contrast, if we were to try to implement the same specification by directly using the factorial ghost function, F\* complains with a effect incompatibility error.

```
[@@expect_failure]
let factorial_bad (n:nat) (out:nat)
  : Tot (r:nat { r == out * factorial n })
  = out * factorial n
```

The error is:

```
Computed type "r: nat{r == out * factorial n}" and
effect "GTot" is not compatible with the annotated
type "r: nat{r == out * factorial n}" effect "Tot"
```

So, while  $F^*$  forbids using ghost computations in Tot contexts, it seems to be fine with accepting a use of factorial in specifications, e.g., in the type r:nat {  $r == out * factorial n }$ . We'll see in a moment why this is permitted.

## 26.3 Erasable and Non-informative Types

In addition to using the GTot effect to classifies computations that must be erased, F\* also provides a way to mark certain *value types* as erasable.

Consider introducing an inductive type definition that is meant to describe a proof term only and for that proof term to introduce no runtime overhead. In a system like Coq, the type of Coq propositions Prop serves this purpose, but prop in F\* is quite different. Instead, F\* allows an inductive type definition to be marked as erasable.

For example, when we looked at the *simply typed lambda calculus (STLC)*, we introduced the inductive type below, to represent a typing derivation for an STLC term. One could define a typechecker for STLC and give it the type shown below to prove it correct:

```
val check (g:env) (e:exp) : (t : typ & typing g e t)
```

However, this function returns both the type t:typ computed for e, we well as the typing derivation. Although the typing derivation may be useful in some cases, often returning the whole derivation is unnecessary. By marking the definition of the typing inductive as shown below (and keeping the rest of the definition the same), F\* guarantees that the compiler will extract typing g e t to the unit type and correspondinly, all values of typing g e t will be erased to the unit value ()

```
[@@erasable]
noeq
type typing : env -> exp -> typ -> Type = ...
```

Marking a type with the erasable attribute and having it be erased to unit is safe because F\* restricts how erasable types can be used. In particular, no Tot computations should be able to extract information from a value of an erasable type.

Closely related to erasable types are a class of types that are called *non-informative*, defined inductively as follows:

- 1. The type Type is non-informative
- 2. The type prop is non-informative (i.e., unit and all its subtypes)
- 3. An erasable type is non-informative

- 4. A function type x:t -> Tot s is non-informative, if s is non-informative
- 5. A ghost function type x:t -> GTot s is non-informative
- 6. A function type x:t -> C, with user-defined computation type C, is non-informative if the effect label of C has the erasable attribute.

Intuitively, a non-informative type is a type that cannot be case-analyzed in a Tot context.

With this notion of non-informative types, we can now define the restrictions on an erasable type:

- 1. Any computation that pattern matches on an erasable type must return a non-informative type.
- 2. Inductive types with the erasable attribute do not support built-in decidable equality and must also be marked noeq.

## 26.4 The erased type, reveal, and hide

The erasable attribute can only be added to new inductive type definitions and every instance of that type becomes erasable. If you have a type like nat, which is not erasable, but some occurrences of it (e.g., in the arguments to Vector.append) need to be erased, the F\* standard library FStar.Ghost.fsti offers the following:

```
(** [erased t] is the computationally irrelevant counterpart of [t] *)
[@@ erasable]
val erased (t:Type u#a) : Type u#a
```

FStar. Ghost also offers a pair of functions, reveal and hide, that form a bijection between a and erased a.

Importantly, reveal v breaks the abstraction of v:erased a returning just an a, but doing so incurs a GTot effect—so, reveal cannot be used in an arbitrary Tot contexts.

Dually, hide v can be used to erase v:a, since a Tot context cannot depend on the value of an erased a.

The SMT patterns on the two lemmas allow F\* and Z3 to automatically instantiate the lemmas to relate a value and its hidden counterpart—*this chapter* provides more details on how SMT patterns work.

#### Implicit coercions

FStar.Ghost.erased, reveal, and hide are so commonly used in F\* that the compiler provides some special support for it. In particular, when a term v:t is used in a context that expects an erased t, F\* implicitly coerces v to hide v. Likewise, when the context expects a t where v:erased t is provided, F\* implicitly coerces v to reveal v.

The following examples illustrates a few usages and limitations. You can ask  $F^*$  to print the code with implicits enabled by using --dump\_module RevealHideCoercions --print\_implicits.

```
module RevealHideCoercions
open FStar.Ghost

let auto_hide (x:nat) : erased nat = x
let auto_reveal (x:erased nat) : GTot nat = x

[@@expect_failure] //Expect GTot
let auto_reveal_2 (x:erased nat) : Tot nat = x

let incr (x:nat) : nat = x + 1
let incr_e (x:erased nat) : erased nat = incr x

let incr' (x:nat) : GTot nat = incr_e x

[@@expect_failure]
let poly (x:nat) (y:erased nat) = x == y
```

A few comments on these examples:

- The first two functions illustrate how a nat is coerced implicitly to erased nat. Note, the effect of auto\_reveal is GTot
- auto\_reveal\_2 fails, since the the annotation claims, incorrectly, that the effect label is Tot
- incr is just a nat -> nat function.
- incr\_e is interesting because it calls incr with an erased nat and the annotation expects an erased nat too. The body of incr\_e is implicitly coerced to hide (incr (reveal x))
- incr' is interesting, since it calls incr\_e: its body is implicitly coerced to reveal (incr\_e (hide x))
- Finally, poly shows the limitations of implicit coercion: F\* only inserts coercions when the expected type of the term in a context and the type of the term differ by an erased constructor. In poly, since == is polymorphic, the expected type of the context is just an unresolved unification variable and, so, no coercion is inserted. Instead, F\* complains that y has type erased nat when the type nat was expected.

# **26.5 Using Ghost Computations in Total Contexts**

We have already noted that Tot < GTot, enabling Tot computations to be re-used in GTot contexts. For erasure to be sound, it is crucial that GTot terms cannot be used in Tot contexts, and indeed,  $F^*$  forbids this in general. However, there is one exception where we can directly invoke a GTot computation in a Tot context without wrapping the result in GTot context without wrapping the GTot context with GTot where GTot context with GTot context with GTot GTot GTot GTot GTot GTot GTot GTot

## 26.5.1 Effect Promotion for Non-informative Types

Consider a term f with type GTot s, where s is a non-informative type. Since s is non-informative, no total context can extract any information from f. As such, F\* allows implicitly promoting GTot s, when s is a non-informative type.

For instance, the following is derivable, hide (factorial 0): Tot (erased nat): let's work through it in detail.

1. We know that that factorial n : GTot nat

- 2. Recall from the discussion on *evaluation order* and the application of functions to effectful arguments, hide (factorial 0) is equivalent to let x = factorial 0 in hide x, where x:nat and hide x : Tot (erased nat).
- 3. From the rule for sequential composition of effectful terms, the type of let x = factorial 0 in hide x should be GTot (erased nat), since GTot = lub GTot Tot.
- 4. Since erased nat is a non-informative type, GTot (erased nat) is promoted to Tot (erased nat), which is then the type of hide (factorial 0).

Effect promotion for ghost functions returning non-informative types is very useful. It allows one to mix ghost computations with total computations, so long as the result of the ghost sub-computation is hidden with an erased type. For instance, in the code below, we use hide (factorial (n - 1)) and use the result  $f_n_1$  in an assertion to or some other proof step, all within a function that is in the Tot effect.

```
let rec factorial_tail_alt (n:nat) (out:nat)
  : Tot (r:nat { r == out * factorial n })
  = if n = 0 then out
  else (
    let f_n_1 = hide (factorial (n - 1)) in
    let result = factorial_tail_alt (n - 1) (n * out) in
    assert (result == (n * out) * f_n_1);
    result
  )
```

# 26.6 Revisiting Vector Concatenation

We now have all the ingredients to understand how the vector append example shown at the start of this chapter works. Here, below, is a version of the same code with all the implicit arguments and reveal/hide operations made explicit.

```
module VecErasedExplicit
open FStar.Ghost
noeq
type vec a : nat -> Type =
  | Nil : vec a 0
  | Cons : #n:erased nat -> hd:a -> tl:vec a (reveal n) -> vec a (reveal n + 1)
let rec append #a (#n #m:erased nat) (v0:vec a (reveal n)) (v1:vec a (reveal m))
  : Tot (vec a (reveal n + reveal m))
        (decreases (reveal n))
  = match v0 with
    | Nil -> v1
    | Cons #_ #n_tl hd tl ->
      Cons #a
           #(hide (reveal n_tl + reveal m))
           (append #a
                   #n tl
                   #m
                   †1
                   v1)
```

**Definition of vec** 

In the definition of the inductive type vec a, we have two occurrences of reveal. Consider vec a (reveal n), the type of the tl of the vector. reveal n is a ghost computation of type GTot nat, so vec a (reveal n): GTot Type. But, since Type is non-informative, GTot Type is promoted to Tot Type. The promotion from GTot Type to Tot Type is pervasive in  $F^*$  and enables ghost computations to be freely used in types and other specifications.

The vec a (reveal n + 1) in the result type of Cons is similar. Here reveal n + 1 has type GTot nat, but applying it to vec a produces a GTot Type, which is promoted to Tot Type.

#### Type of append

The type of append has four occurrences of reveal. Three of them, in the type of v0, v1, and the return type behave the same as the typing the fields of Cons: the GTot Type is promoted to Tot Type.

One additional wrinkle is in the decreases clause, where we have an explicit reveal n, since what decreases on each recursive call is the nat that's in bijection with the parameter n, rather than n itself. When F\* infers a decreases clause for a function, any erased terms in the clause are automatically revealed.

#### **Definition of append**

The recursive call instantiates the index parameters to n\_tl and m, which are both erased.

When constructing the Cons node, its index argument is instantiated to hide (reveal  $n_t + reveal m$ ). The needless addition is marked with a hide enabling that  $F^*$  compiler to erase it. As we saw before in factorial\_tail\_alt, using hide allows one to mingle ghost computations (like (reveal n - 1)) with total computations, as needed for specifications and proofs.

All of this is painfully explicit, but the implicit reveal/hide coercions inserted by  $F^*$  go a long way towards make things relatively smooth.

**CHAPTER** 

### **TWENTYSEVEN**

## **DIVERGENCE, OR NON-TERMINATION**

Most dependently typed languages are not Turing complete. This is because, as explained *earlier*, it is crucial to the soundness of a type theory to have all functions terminate. This means that you cannot program, say, an interpreter for a general-purpose programming language in a language like Coq, since such an interpreter would not be able to handle programs that intentionally loop forever.<sup>1</sup>

F\*'s logical core of total (and ghost) functions can only express terminating computations. However, F\*'s also allows expressing non-terminating or *divergent* computations, relying on the effect system to isolate divergent computations from the logical core. In particular, the computation type Dv t describes a computation that may loop forever, but if it completes, it returns a value of type t.

Relying on the effect system as a dependency tracking mechanism,  $F^*$  ensures that Tot computations cannot rely on Dv computations by placing Dv above Tot in the effect hierarchy, while, conversely, a total computation Tot t can be silently promoted to Dv t, the type of computations that may not terminate, i.e., Tot < Dv in the effect partial order.

Recursive functions that return computations in the Dv effect are not checked for termination. As such, using the Dv effect, one can write programs such as the one below, which computes Collatz sequences—whether or not this program terminates for all inputs is an open problem.

```
(* You can program a function to compute Collatz sequences
    ... though no one knows if it actually terminates for all n *)
let rec collatz (n:pos)
    : Dv (list pos)
    = if n = 1 then [n]
    else if n % 2 = 0
        then n::collatz (n / 2)
    else n::collatz (3 * n + 1)
```

In this chapter, we'll look in detail at the Dv effect and how it interacts with other features of the language, including the other effects, recursive type definitions, and the styles of programming and proving it enables.

<sup>&</sup>lt;sup>1</sup> In place of general recursion and potential non-termination, other dependently typed languages like Coq and Agda offer features like corecursion and coinduction. Coinduction can be used to express a class of *productive* non-terminating programs. For instance, using coinduction, one could program a web server that loops forever to handle an infinite stream of requests, while producing a response for each request in a finite amount of time. Even the collatz function can be given a corecursive definition that computes a potentially infinite stream of numbers. However, not all non-terminating computations can be implemented with coinduction/corecursion. F\* does not yet support coinduction.

## 27.1 The Dv effect

The effect Dv (for divergence) is a primitive effect in F\*. Computations in Dv may not terminate, even with infinite resources. In other words, computations in the Dv effect have the observational behavior of non-termination. For example, the following loop function has type unit -> Dv unit and it always diverges when called:

```
let rec loop (): Dv unit = loop ()
```

If we remove the Dv effect label annotation, then  $F^*$  treats the function as total and will try to prove that the recursive call terminates, according to its usual termination checking rules, i.e.,  $F^*$  will attempt to prove () << () which fails, as expected.

Since the Dv effect admits divergence,  $F^*$  essentially turns-off the termination checker when typechecking Dv computations. So the recursive loop () call does not require a decreasing termination metric.

## 27.2 Partial correctness semantics of Dv

The Tot effect in F\* has a *total correctness* semantics. That is, if a term has type e:Tot t, then e terminates and produces a value of type t.

Terms with type Dv t have a *partial correctness* semantics. That is, a term e:Dv t, e may either run forever, but if it terminates then the resulting value has type t.

Another perspective is that aside from disabling the termination checking features of  $F^*$ , all other type-checking constraints are enforced on Dv term. This means that one can still give interesting sound, specifications to Dv programs, e.g., the type below proves that if the Collatz function terminates, then the last element of the sequence is 1.

If, for example, in the base case we were to return the empty list [] rather than [n], then F\* would refuse to accept the program, since the program could terminate while returning a value that is not an element of the annotated return type.

# 27.3 Isolating Dv from the logical core

Since Dv terms need not terminate, a program that always loops forever can be given any return type. For instance, the program below has return type False:

```
let rec dv_false () : Dv False = dv_false()
```

Importantly, a term of type Dv False should not be confused as a proof of False, since that would lead immediately to unsoundness of F\*'s logical core. In particular, it should be impossible to turn a e:Dv t into a term of type Tot t. This is achieved by F\*'s effect system, which treats Tot as a sub-effect of Dv, i.e., Tot < Dv, in the effect order. As explained in earlier, this ensures that no Tot term can depend on a Dv term, maintaining soundness of the total correctness interpretation of Tot.

As an example, the following attempt to "cast" dv\_false to Tot fails, as does trying to use dv\_false to produce incorrect proofs of other types.

```
[@@expect_failure]
let tot_false : Tot False = dv_false()
[@@ expect_failure]
let bad_zero : Tot (y:int{y == 0}) = dv_false (); 1
```

While F\* does not allow Tot computations to depend on Dv computations, going the other way is perfectly fine. Intuitively, always terminating computations are potentially non-terminating. We can think of it like a *weakening* of the specification:

```
let add_one (x:int) : int = x + 1
let add_one_div (x:int) : Dv int = add_one x
```

The effect system of  $F^*$  automatically *lifts* Tot computations into Dv, meaning that Tot functions can be seamlessly used in Dv functions.

The weakening of Tot terms to other effects is so pervasive in  $F^*$  that one hardly even thinks about it, e.g., in the collatz program, sub-terms like  $n \neq 2$  are in Tot but are easily used within a computation in the Dv effect.

# 27.4 No extrinsic proofs for Dv computations

One important consequence of any effectful code, including Dv, being outside the logical core of F\* is that it is not possible to do *extrinsic proofs* about effectful code. One cannot even state properties of Dv computations in specifications, since even specifications must be total. For example, even stating the following lemma is illegal:

```
[@@expect_failure]
val collatz_property (n:pos)
    : Lemma (Cons? (collatz n) /\ last (collatz n) = 1)
```

This is nonsensical in  $F^*$  since writing Cons? (collatz n) supposes that collatz n is *defined*, whereas it might actually just loop forever.

The only way to state properties about divergent programs is to encode the property intrinsically in the computation type, as we saw above.

```
let last #a (l:list a { Cons? l }) : a = L.index l (L.length l - 1)
val collatz_ends_in_one (n:pos)
: Dv (l:list pos { Cons? l /\ last l == 1 })
```

#### 27.4.1 Exercise

Define a predicate collatz\_spec (n:pos) (1:list pos) : bool that decides if 1 is a valid Collatz sequence starting at n.

```
Implement val collatz' (n:pos) : Dv (l:list pos { collatz_spec n l }).
```

What does this type mean? Are there other ways to implement collatz' with the same type?

#### Answer

```
let rec collatz_spec (n:pos) (1:list pos)
   : Tot bool (decreases 1)
   = match 1 with
   | [] -> false
```

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```
| hd :: tl ->
      hd = n \&\& (
        if hd = 1 then tl = []
        else if n\%2 = 0 then collatz_spec (n/2) tl
        else collatz_spec (3*n + 1) tl
// collatz' may loop forever on some inputs
// but if it completes it always returns a valid
// Collatz sequence
let rec collatz' (n:pos)
  : Dv (l:list pos { collatz_spec n l } )
  = if n = 1 then [n]
   else if n \% 2 = 0
    then n::collatz' (n / 2)
    else n::collatz' (3 * n + 1)
// here's another bogus implementation that always loops
let rec collatz'' (n:pos)
  : Dv (l:list pos { collatz_spec n l } )
  = collatz'' n
```

# 27.5 General Recursive Types and Impredicativity with Dv

Aside from disabling the decreases metric on recursive functions in Dv,  $F^*$  also disables two other forms of termination checking on Dv computations.

Recall from a *previous chapter* that inductive type definitions are subject to the *strict positivity* condition, since non-positive definitions allow the definition of recursive types and non-terminating computations. However, since computations in the Dv effect are already allowed to loop forever, the strict positivity condition can be relaxed when Dv types are involved. For example, one can define this:

```
noeq
type nonpos =
    | NonPos : (nonpos -> Dv False) -> nonpos

let loop_nonpos' (f:nonpos) : Dv False =
    let NonPos g = f in g f

let loop_nonpos () : Dv False = loop_nonpos' (NonPos loop_nonpos')
```

The type nonpos is not strictly positive, since it appears to the left of an arrow in a field of one of its constructors. Indeed, using nonpos it is possible to define (without using let rec) an infinitely looping program loop\_nonpos()—however, the type Dv False tells us that this program may loop forever, and the infinite loop is safely isolated from F\*'s logical core.

The other place in  $F^*$ 's type system where termination checking comes into play is in the *universe levels*. As we learned previously, the logical core of  $F^*$  is organized into an infinite hierarchy with copies of the  $F^*$  type system arranged in a tower of universes. This stratification is necessary to prevent inconsistencies within the logical core. However, terms in the Dv effect are outside the logical core and, as such, restrictions on the universe levels no longer apply. As the snippet below shows a total function returning a type in universe u#a resides in universe u#(a + 1). However, a Dv function

returning a type in u#a is just in universe 0, since the only way to obtain the type dv\_type returns is by incurring a Dv effect and moving outside F\*'s logical core.

```
let tot_type : Type u#(a + 1) = unit -> Tot (Type u#a)
let dv_type : Type0 = unit -> Dv (Type u#a)
```

## 27.6 Top-level Effects

A top-level F\* term is not meant to be effectful. If one defines the following term, F\* accepts the term but raises a warning saying "Top-level let bindings must be total—this term may have effects".

```
let inconsistent : False = loop_nonpos()
```

Top-level effects can be problematic for a few reasons:

- 1. The order of evaluation of the effects in top-level terms is undefined for programs with multiple modules—it depends on the order in which modules are loaded at runtime.
- 2. Top-level effects, particularly when divergence is involved, can render F\*'s typechecking context inconsistent. For example, once inconsistent is defined, then any other assertion can be proven.

Nevertheless, when used carefully, top-level effects can be useful, e.g., to initialize the state of a module, or to start the main function of a program. So, pay attention to the warning F\* raises when you have a top-level effect and make sure you really know what you're doing.

# 27.7 Example: Untyped Lambda Calculus

In this section, we put together the various things we've learned about Dv computations to define several variants of an untyped lambda calculus.

You can refer back to our prior development of the *simply typed lambda calculus* if you need some basic background on the lambda calculus.

## 27.7.1 Interpreting Deeply Embedded Lambda Terms

We start by defining the syntax of untyped lambda terms, below. The variables use the de Bruijn convention, where a index of a variable counts the number of lambda-binders to traverse to reach its binding occurrence. The Lam case just has the body of the lambda term, with no type annotation on the binder, and no explicit name for the variable.

```
let var = nat
type term =
    | Var : var -> term
    | Int : int -> term
    | Lam : term -> term
    | App : term -> term
```

As usual, we can define what it means to substitute a variable x with a (closed) term v in t—this is just a regular Tot function.

```
let rec subst (x:var) (v:term) (t:term)
   : Tot term (decreases t) =
   match t with
   | Var y -> if x = y then v else t
   | Int _ -> t
   | Lam t -> Lam (subst (x + 1) v t)
   | App t0 t1 -> App (subst x v t0) (subst x v t1)
```

Finally, we can define an interpreter for term, which can (intentionally) loop infinitely, as is clear from the Dv type annotation.

```
(* This interpreter can (intentionally) loop infinitely *)
let rec interpret (t:term)
 : Dv (option term)
 = match t with
   | Var
    | Int _
    | Lam _- > Some t
    | App t0 t1 ->
     let head = interpret t0 in
     match head with
     | None -> None
      | Some (Lam body) -> interpret (subst 0 t1 body)
      | _ -> None //type error, expected a function
(*(x. x x) (x. x x) *)
let loops () : Dv _ = interpret (App (Lam (App (Var 0)))
                                     (Lam (App (Var 0) (Var 0))))
```

#### **Exercise**

This exercise is designed to show how you can prove non-trivial properties of Dv computations by giving them interesting dependent types.

The substitution function defined here is only sound when the term being substituted is closed, otherwise, any free variables it has can be captured when substituted beneath a lambda.

A term is closed if it satisfies this definition:

```
let rec closed' (t:term) (offset:int)
    : bool
    = match t with
    | Int _ -> true
    | Var i -> i <= offset
    | Lam t -> closed' t (offset + 1)
    | App t0 t1 -> closed' t0 offset && closed' t1 offset
let closed t = closed' t (-1)
```

Restrict the type of subst so that its argument is  $v : term \{ closed \ v \}$ —you will have to also revise the type of its other argument for the proof to work.

Next, give the following type to the interpreter itself, proving that interpreting closed terms produces closed terms, or loops forever.

#### Answer

```
module Part4.UTLCEx1
let var = nat
type term =
 | Var : var -> term
 | Int : int -> term
 | Lam : term -> term
  | App : term -> term -> term
//SNIPPET_START: closed$
let rec closed' (t:term) (offset:int)
  : bool
 = match t with
    | Int _ -> true
    | Var i \rightarrow i \le offset
    | Lam t -> closed' t (offset + 1)
    | App t0 t1 -> closed' t0 offset && closed' t1 offset
let closed t = closed' t (-1)
//SNIPPET_END: closed$
let rec closed'_weaken (t:term) (offset offset':int)
  : Lemma
    (requires closed' t offset /\
              offset <= offset')</pre>
    (ensures closed' t offset')
 = match t with
    | Int _ -> ()
    | Var _ -> ()
    | Lam t -> closed'_weaken t (offset + 1) (offset' + 1)
    | App t0 t1 ->
      closed'_weaken t0 offset offset';
      closed'_weaken t1 offset offset'
let rec subst (x:var)
              (v:term { closed v })
              (t:term { closed' t x })
  : Tot (t1:term { closed' t1 (x - 1) }) (decreases t) =
 match t with
  | Var y \rightarrow if x = y then (closed'_weaken v (-1) (x - 1); v) else t
```

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```
| Int _ -> t
  | Lam t -> Lam (subst (x + 1) v t)
  | App t0 t1 \rightarrow App (subst x v t0) (subst x v t1)
//SNIPPET_START: interpret$
let rec interpret (t:term { closed t })
  : Dv (option (t:term { closed t }))
 = match t with
    | Int _
    | Lam _ -> Some t
    | App t0 t1 ->
     let head = interpret t0 in
      match head with
      | None -> None
      | Some (Lam body) -> interpret (subst 0 t1 body)
      _ -> None //type error, expected a function
//SNIPPET_END: interpret$
```

#### 27.7.2 Denoting Lambda Terms into an F\* Recursive Type

We now look at a variation on the interpreter above to illustrate how (non-positive) recursive types using Dv can also be used to give a semantics to untyped lambda terms.

Consider the type dyn shown below—it has a non-positive constructor DFun. We can use this type to interpret untyped lambda terms into dynamically typed, potentially divergent,  $F^*$  terms, showing, in a way, that untyped lambda calculus is no more expressive than  $F^*$  with the Dv effect.

The program denote shown below gives a semantics to term using dyn. It is parameterized by a ctx : ctx\_t, which interprets the free variables of the term into dyn.

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```
| DFun f -> f (denote t1 ctx)
| DErr msg -> DErr msg
| DInt _ -> DErr "Cannot apply an integer"
```

We look at the cases in detail:

- In the Var case, the interretation just refers to the context.
- Integers constants in term are directly interpreted to integers in dyn.
- The case of Lam is the most interesting: An lambda abstraction in term is interpreted as an F\* function dyn -> Dv dyn, recursively calling the denotation function on the body when the function is applied. Here's where we see the non-positivity of DFun at play—it allows us to inject the function into the dyn type.
- Finally, in the application case, we interpret a syntactic application in term as function application in F\* (unless the head is not a function, in which case we have a type error).

#### **Exercise**

This exercise is similar in spirit to the previous one and designed to show that you can prove some simple properties of denote by enriching its type.

Can you prove that a closed term can be interpreted in an empty context?

First, let's refine the type of contexts so that it only provides an interpretation to only some variables:

Next, let's define free t to compute the greatest index of a free variable in a term.

```
let max (x y:int) : int = if x < y then y else x
let rec free (t:term)
    : int
    = match t with
    | Var x -> x
    | Int _ -> -1
    | Lam t -> free t - 1
    | App t0 t1 -> max (free t0) (free t1)
```

Can you give the same denote function shown earlier the following type?

```
val denote (t:term) (ctx:ctx_t (free t))
: Dv dyn
```

Next, define the empty context as shown below:

```
let empty_context : ctx_t (-1) = fun _ -> false_elim ()
```

Given a closed term t: term { closed t }, where closed t = (free t = -1), can you use denote to give an interpretation to closed terms in the empty context?

#### Answer

```
type term =
 | Var : var -> term
  | Int : int -> term
 | Lam : term -> term
 | App : term -> term -> term
//SNIPPET_START: free$
let max (x y:int) : int = if x < y then y else x</pre>
let rec free (t:term)
  : int
 = match t with
   | Var x -> x
    | Int _ -> -1
    | Lam t -> free t - 1
    | App t0 t1 -> max (free t0) (free t1)
//SNIPPET_END: free$
noeq
type dyn =
 | DErr : string -> dyn
 | DInt : int -> dyn
 | DFun : (dyn \rightarrow Dv dyn) \rightarrow dyn
//SNIPPET_START: ctx_t$
let ctx_t (i:int) = x:nat\{x \le i\} \rightarrow dyn
//SNIPPET_END: ctx_t$
let shift #i (ctx:ctx_t i) (v:dyn)
 : ctx_t (i + 1)
 = fun n \rightarrow if n = 0 then v else ctx (n - 1)
(* This is similar to the interpreter, but
   "interprets" terms into the F* type dyn
   rather than just reducing syntax to syntax *)
let rec denote (t:term)
               (ctx:ctx_t (free t))
  : Dv dyn
 = match t with
   | Var v -> ctx v
    | Int i -> DInt i
    | Lam t -> DFun (fun v -> denote t (shift ctx v))
    | App t0 t1 ->
     match denote t0 ctx with
      | DFun f -> f (denote t1 ctx)
      | DErr msg -> DErr msg
      | DInt _ -> DErr "Cannot apply an integer"
//SNIPPET_START: empty_context$
let empty_context : ctx_t (-1) = fun _ -> false_elim ()
//SNIPPET_END: empty_context$
let closed t = free t = -1
```

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```
let denote_closed (t:term { closed t })
    : Dv dyn
    = denote t empty_context
```

#### 27.7.3 Shallowly Embedded Dynamically Typed Programming

In the previous example, we saw how the syntax of untyped lambda terms can be interpreted into the  $F^*$  type dyn. In this example, rather than going via the indirection of the syntax of lambda terms, we show how the type dyn can be used directly to embed within  $F^*$  a small Turing complete, dynamically typed programming language.

We can start by lifting the F\* operations on integers and functions to (possibly failing) operations on dyn.

```
(* Lifting operations on integers to operations on dyn *)
let lift (op: int -> int -> int) (n m:dyn) : dyn
 = match n. m with
    | DInt i, DInt j -> DInt (op i j)
    | _ -> DErr "Expected integers"
let mul = lift op_Multiply
let sub = lift op_Subtraction
let add = lift op_Addition
let div (n m:dyn)
 = match n, m with
    | DInt i, DInt j ->
      if j = 0 then DErr "Division by zero"
      else DInt (i / j)
    | _ -> DErr "Expected integers"
let mod (n m:dyn)
  = match n, m with
    | DInt i, DInt j ->
      if j = 0 then DErr "Division by zero"
      else DInt (i % j)
    | _ -> DErr "Expected integers"
```

We also encode provide operations to compare dyn-typed integers and to branch on them, treating 0 as false.

```
(* Branching *)
let if_ (d:dyn) (then_ else_:dyn) =
    match d with
    | DInt b ->
        if b<>0 then then_ else else_
        | _ -> DErr "Can only branch on integers"

(* comparison *)
let eq_ (d:dyn) (d':dyn)
    : dyn
    = match d, d' with
        | DInt i, DInt j -> DInt (if i = j then 1 else 0)
        | _ -> DErr "Can only compare integers"
```

For functions, we can provide combinators to apply functions and, importantly, a combinator fix that provides general recursion.

An aside on the arity of recursive functions: You may wonder why fix is defined as shown, rather than fix\_alt below, which removes a needless additional abstraction. The reason is that with fix\_alt, to instruct  $F^*$  to disable the termination checker on the recursive definition, we need an additional Dv annotation: indeed, evaluating fixalt f in a call-by-value semantics would result, unconditionally, in an infinite loop, whereas fix f would immediately return the lambda term fun  $n \to f$  (fix f) n. In other words, eta reduction (or removing redundant function applications) does not preserve semantics in the presence of divergence.

With that, we can program non-trivial dynamically typed, general recursive programs within F\* itself, as seen below.

All of which is to illustrate that with general recursion and non-positive datatypes using Dv, F\* is a general-purpose programming language like ML, Haskell, Lisp, or Scheme, or other functional languages you may be familiar with.

**CHAPTER** 

#### **TWENTYEIGHT**

#### PRIMITIVE EFFECT REFINEMENTS

**Note:** This chapter provides some background on Floyd-Hoare logic and weakest-precondition-based verification condition generation. This is necessary if you want to understand a bit about how  $F^*$  infers the logical constraints needed to prove the correctness of a program. It is also useful background for more advanced material in subsequent chapters about defining custom effects in  $F^*$ , e.g., effects to model state, exceptions, or concurrency.

Refinement types  $x:t\{p\}$  refine value types t and allow us to make more precise assertions about the values in the program. For example, when we have  $v: x:int\{x >= 0\}$ , then not only we know that v is an int, but also that v >= 0.

In a similar manner, F\* allows refining computation types with specifications that describe some aspects of a program's computational behavior. These *effect refinements* can, in general, be defined by the user in a reasoning system of their choosing, e.g., the refinements may use separation logic, or they may count computation steps.

However, F\* has built-in support for refining the specification of pure programs with effect refinements that encode the standard reasoning principles of Floyd-Hoare Logic and weakest precondition-based calculi. Foreshadowing what's about to come in this chapter, we can write the following specification for the factorial function:

```
open FStar.Mul
let rec factorial (x:int)
   : Pure int (requires x >= 0) (ensures fun r -> r >= 1)
    = if x = 0
      then 1
    else x * factorial (x - 1)
```

Intuitively, this type states that factorial x is a computation defined only when x >= 0 and always terminates returning a value r >= 1. In a way, this type is closely related to other, more familiar, types we have given to factorial so far, e.g., nat  $\rightarrow$  pos, and, indeed, factorial can be used at this type.

```
let fact (x:nat) : pos = factorial x
```

Actually, in all the code we've seen so far, what's happening under the covers is that F\* infers a type for a pure program similar to Pure t pre post and then checks that that type can be subsumed to a user-provided specification of the form Tot t'.

In this chapter, we look into how these Pure specifications work, starting with a primer on Floyd-Hoare Logic and weakest precondition calculi. If the reader is familiar with these, they may safely skip the next subsections, though even if you are an expert, if may be of interest to see how such program logics can be formalized in  $F^*$ .

## 28.1 A Primer on Floyd-Hoare Logic and Weakest Preconditions

Floyd-Hoare Logic is a system of specifications and rules to reason about the logical properties of programs, introduced by Robert Floyd in a paper titled Assigning Meaning to Programs and by Tony Hoare in An axiomatic basis for computer programming. The notation used in most modern presentations (called Hoare triples) is due to Hoare. An algorithm to compute Hoare triples was developed by Edsger Dijkstra presented first in this paper, using a technique called *weakest preconditions*. All of them received Turing Awards for their work on these and other related topics.

For an introduction to these ideas, we'll develop a small imperative language with global variables, presenting

- An operational semantics for the language, formalized as an interpreter.
- A Floyd-Hoare program logic proven sound with respect to the operational semantics.
- And, finally, an algorithm to compute weakest preconditions proved sound against the Floyd-Hoare logic.

Our language has the following abstract syntax:

```
let var = nat
type expr =
                                                   // constants: ..., -1, 0, 1, ...
 | EConst : int -> expr
                                                   // global variables
  | EVar
         : var -> expr
                                                   // arithmetic: e1 + e2
  | EAdd
         : expr -> expr -> expr
type program =
  | Assign : var -> expr -> program
                                                   // x := e
          : program -> program -> program
                                                  // p1; p2
  | Seg
           : expr -> program -> program -> program // if e then p1 else p2
  | Repeat : expr -> program -> program
                                                   // repeat n { p }
```

Expressions includes integer constants, global variables (represented just as natural numbers), and some other forms, e.g., arithmetic expressions like addition.

A program includes:

- Assignments, EAssign x e, representing the assignment of the result of an expression e to a global variable x,
   i.e., x := e
- Seq, to compose programs sequentially
- If to compose programs conditionally
- And Repeat n p, which represents a construct similar to a for-loop (or primitive recursion), where the program p is repeated n times, where n evaluates to a non-negative integer.

Our language does not have while loops, whose semantics are a bit more subtle to develop. We will look at a semantics for while in a subsequent chapter.

#### 28.1.1 Operational Semantics

Our first step in giving a semantics to programs is to define an interpreter for it to run a program while transforming a memory that stores the values of the global variables.

To model this memory, we use the type state shown below:

```
// The state of a program is a map from global variable to integers
let state = var -> int
let read (s:state) (i:var) : int = s i
let write (s:state) (i:var) (v:int)
    : state
    = fun j -> if i=j then v else read s j
```

Writing a small evaluator for expressions is easy:

The interpreter for programs itself takes a bit more work, since programs can both read and write the state. To structure our interpreter, we'll introduce a simple state monad st a. We've seen this construction before in *a previous chapter*—so, look there if the state monad is unfamiliar to you. Recall that F\* has support for monadic let operators: the let! provides syntactic sugar to convenient compose st terms.

```
let st (a:Type) = state -> (a & state)

let get : st state = fun s -> (s, s)

let put (s:state) : st unit = fun _ -> ((), s)

let (let!) #a #b (f:st a) (g: a -> st b) : st b =
  fun s -> let v, s' = f s in g v s'

let return #a (x:a) : st a = fun s -> (x, s)
```

Now, the interpreter itself is a total, recursive function run which interprets a program p as a state-passing function of type st unit, or state -> unit & state.

```
let rec run (p:program)
  : Tot (st unit)
        (decreases %[p;0])
  = match p with
        | Assign x e ->
        let! s = get in
        let v = eval_expr e s in
```

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```
put (write s x v)
    | Seq p1 p2 ->
      run p1;!
      run p2
    | If e p1 p2 ->
      let! s = get in
      let n = eval_expr e s in
      if n <> 0 then run p1 else run p2
    | Repeat e p ->
      let! s = get in
      let n = eval_expr e s in
      if n <= 0 then return ()</pre>
      else run_repeat p n
and run_repeat (p:program) (n:nat)
  : Tot (st unit)
        (decreases %[p; 1; n])
 = if n = 0 then return ()
    else ( run p ;! run_repeat p (n - 1) )
```

Let's look at its definition in detail:

- Assign x e: Evaluate e in the current state and then update the state with a new value of x.
- Seq p1 p2: Simply run p1 and then run p2, where ;! is syntactic sugar for let! \_ = run p1 in run p2.
- If e p1 p2: Evaluate e in the current state, branch on its result and run either p1 or p2
- Repeat e p: Evaluate e to n, and if n is greater than zero, call the mutually recursive run\_repeat n p. Most of the subtlety here is in convincing F\* that this mutually recursive function terminates, but this is fairly straightforward once you know how—we discussed *termination proofs for mutually recursive functions earlier*.

These operational semantics are the ground truth for our programming language—it defines how programs execute. Now that we have that settled, we can look at how a Floyd-Hoare logic makes it possible to reason about programs in a structured way.

#### 28.1.2 Floyd-Hoare Logic

The goal of a Floyd-Hoare logic is to provide a way to reason about a program based on the structure of its syntax, rather than reasoning directly about its operational semantics. The unit of reasoning is called a *Hoare triple*, a predicate of the form {P} c {Q}, where P and Q are predicates about the state of the program, and c is the program itself.

We can *define* Hoare triples for our language by interpreting them as an assertion about the operational semantics, where triple p c q represents, formally, the Hoare triple p c q represents the Hoare tri

The predicate triple p c q is valid, if when executing c in a state that satisfies p results in a state that satisfies q. The predicates p and q are also called precondition and postcondition of c, respectively.

For each syntactic construct of our language, we can prove a lemma that shows how to build an instance of the triple predicate for that construct. Then, to build a proof of program, one stitches together these lemmas to obtain a triple p main q, a statement of correctess of the main program.

#### **Assignment**

Our first rule is for reasoning about variable assignment:

This lemma says that post holds after executing x := e in the initial state s0, if post holds on the initial state updated at x with the value of e.

For example, to prove that after executing z := y + 1 in s0, if we expect the value of z to be greater than zero`, then the assignment rule says that read s0 y + 1 > 0 should hold before the assignment, which is what we would expect.

#### Sequence

Our next lemma about triples stitches together triples for two programs that are sequentially composed:

The lemma says that if we can derive the Hoare triples of the two statements such that postcondition of p1 matches the precondition of p2, then we can compose them.

#### Conditional

The lemma for conditionals is next:

It says that to derive the postcondition post from the If e p1 p2, we should be able to derive it from each of the branches with the same precondition pre. In addition, since we know that p1 executes only when e is non-zero, we can add these facts to the preconditions of each branch.

#### Repeat

In all the cases so far, these lemmas are proved automated by F\* and Z3. In the case of repeats, however, we need to do a little more work, since an inductive argument is involved.

The rule for repeat requires a *loop invariant* inv. The loop invariant is an assertion that holds before the loop starts, is maintained by each iteration of the loop, and is provided as the postcondition of the loop.

The lemma below states that if we can prove that triple inv p inv, then we can also prove triple inv (Repeat e p) inv.

```
// We need an auxilary lemma to prove it by induction for repeat_n
let rec repeat_n (p:program) (inv:state -> prop) (n:nat)
  : Lemma
    (requires triple inv p inv)
    (ensures (forall s0. inv s0 ==> inv (snd (run_repeat p n s0))))
= if n = 0 then ()
  else repeat_n p inv (n - 1)
// Then, we use that auxiliary lemma to prove the main
// rule for reasoning about repeat using an invariant
let repeat (e:expr) (p:program) (inv:state -> prop)
  : Lemma
    (requires triple inv p inv)
    (ensures triple inv (Repeat e p) inv)
  = introduce forall s0. inv s0 ==> inv (snd (run (Repeat e p) s0)) with
   introduce _ ==> _ with
      inv_s0 . (
        let n = eval_expr e s0 in
        if n \le 0 then ()
        else repeat_n p inv n
   )
```

The auxiliary lemma repeat\_n proves that run\_repeat p n preserves inv, if p preserves inv.

To call this lemma from the main repeat lemma, we need to "get our hands on" the initial state s0, and the *syntactic sugar to manipulate logical connectives* makes this possible.

#### Consequence

The final lemma about our Hoare triples is called the rule of consequence. It allows strengthening the precondition and weakening the postcondition of a triple.

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```
(ensures
    triple pre' p post')
= ()
```

A precondition of a program is an obligation before the statement is executed. So if p requires pre, we can always strengthen the precondition to pre', provided pre' ==> pre, i.e. it is logically valid to require more than necessary in the precondition. Similarly, postcondition is what a statement guarantees. So if p guarantees post, we can always weaken it to guarantee less, i.e. some post' where post ==> post'.

#### 28.1.3 Weakest Preconditions

The rules of Floyd-Hoare logic provide an abstract way to reason about programs. However, the rules of the logic are presented declaratively. For example, to apply the sequence rule, one has derive triples for each component in a way that they prove exactly the same assertion (pre\_mid) about the intermediate state. There may be many ways to do this, e.g., one could apply the rule of consequence to weaken the postcondition of the first component, or to strengthen the precondition of the second component.

Dijkstra's system of weakest preconditions eliminates such ambiguity and provides an *algorithm* for computing valid Hoare triples, provided the invariants of all loops are given. This makes weakest preconditions the basis of many program proof tools, since given a program annotated with loop invariants, one can simply compute a logical formula (called a verification condition) whose validity implies the correctness of the program.

At the core of the approach is a function  $\Psi$  (c, Q), which computes a unique, weakest precondition P for the program c and postcondition Q. The semantics of  $\Psi$  is that  $\Psi$  (c, Q) is the weakest precondition that should hold before executing c for the postcondition Q to be valid after executing c. Thus, the function  $\Psi$  assigns meaning to programs as a transformer of postconditions Q to preconditions  $\Psi$  (s, Q).

The wp function for our small imperative language is shown below:

```
let rec wp (c:program) (post: state -> prop)
  : state -> prop
  = match c with
    | Assign x e ->
      fun s0 -> post (write s0 x (eval_expr e s0))
    | Seq p1 p2 ->
      wp p1 (wp p2 post)
    | If e p1 p2 ->
      fun s0 ->
        (eval_expr e s0 =!= 0 ==> wp p1 post s0) /
        (eval\_expr e s0 == 0 ==> wp p2 post s0)
    | Repeat e p ->
      fun s0 ->
        (exists (inv:state -> prop).
          inv s0 /
          (forall s. inv s ==> post s) /
          (forall s. inv s ==> wp p inv s))
```

- The case of Assign is identical to the assignment lemma shown earlier.
- The case of Seq sequentially composes the wp's. That is, to prove the post after running p1;; p2 we need to prove wp p2 post after running p1. It may be helpful to read this case as the equivalent form fun s0 -> wp

p1 (fun s1 -> wp p2 post s1) s0, where s0 is the initial state and s1 is the state that results after running just p1.

- The If case computes the WPs for each branch and requires them to be proven under the suitable branch condition.
- The Repeat case is most interesting: it involves an existentially quantified invariant inv, which is the loop invariant. That is, to reason about Repeat n p, one has to somehow find an invariant inv that is true initially, and implies both the WP of the loop body as well as the final postcondition.

The wp function is sound in the sense that it computes a sufficient precondition, as proven by the following lemma.

```
let rec wp_soundness (p:program) (post:state -> prop)
  : Lemma (triple (wp p post) p post)
  = match p with
    | Assign x e \rightarrow ()
    | Seq p1 p2 ->
      wp_soundness p2 post;
      wp_soundness p1 (wp p2 post)
    | If e p1 p2 ->
      wp_soundness p1 post;
      wp_soundness p2 post
    | Repeat e p ->
      introduce forall s0. wp (Repeat e p) post s0 ==>
                      post (snd (run (Repeat e p) s0)) with
      introduce _ ==> _ with
        _ . (
          eliminate exists (inv:state -> prop).
                             inv s0 /\
                             (forall s. inv s ==> post s) /\
                             (forall s. inv s ==> wp p inv s)
          returns _
          with inv_props. (
            wp_soundness p inv;
            repeat e p inv
          )
      )
```

One could also prove that wp computes the weakest precondition, i.e., if triple p c q then forall s. p s ==> wp c q s, though we do not prove that formally here.

#### 28.1.4 A Sample Program Proof

We now illustrate some sample proofs using our Hoare triples and wp function. To emphasize that Hoare triples provide an *abstract* way of reasoning about the execution of programs, we define the hoare p c q an alias for triple p c q marked with an attribute to ensure that F\* and Z3 cannot reason directly about the underlying definition of triple—that would allow Z3 to find proofs by reasoning about the operational semantics directly, which we want to avoid, since it would not scale to larger programs. For more about the opaque\_to\_smt and reveal\_opaque construct, please see *this section on opaque definitions*.

```
[@@"opaque_to_smt"]
let hoare p c q = triple p c q
let wp_hoare (p:program) (post:state -> prop)

(continues on next page)
```

The lemmas above are just restatements of the wp\_soundness and consequence lemmas that we've already proven. Now, these are the only two lemmas we have to reason about the hoare p c q predicate.

Next, we define some notation to make it a bit more convenient to write programs in our small language.

Finally, we can build proofs of some simple, loop-free programs automatically by computing their wp using wp\_hoare and applying hoare\_consequence to get  $F^*$  and Z3 to prove that the inferred WP is implied by the annotated precondition.

This recipe of computing verification conditions using WPs and then checking the computed WP against the annotated specification using a solver like Z3 is a very common and powerful pattern. In fact, as we'll see below, the methodology that we've developed here for our small imperative language is exactly what the  $F^*$  typechecker does (at a larger scale and for the whole  $F^*$  language) when checking an  $F^*$  program.

## 28.2 The PURE Effect: A Dijkstra Monad for Pure Computations

F\* provides a weakest precondition calculus for reasoning about pure computations. The calculus is based on a *Dijkstra Monad*, a construction first introduced in this paper. In this chapter, we will learn about Dijkstra Monad and its usage in specifying and proving pure programs in F\*.

The first main difference in adapting the Hoare triples and weakest precondition computations that we saw earlier to the setting of F\*'s functional language is that there are no global variables or mutable state (we'll see about how model mutable state in F\*'s effect system later). Instead, each pure expression in F\*'s returns a value and the postconditions that we will manipulate are predicates about these values, rather than state predicates.

To illustrate, we sketch the definition of pure WPs below.

- The WP of a constant c is just the postcondition Q applied to c.
- The WP of a let binding is a sequential composition of WPs, applied to the *values* returned by each sub-expression
- The WP of a condition is the WP of each branch, weakened by the suitable branch condition, as before.

The F\* type system internalizes and generalizes this WP construction to apply it to all F\* terms. The form this takes is as a computation type in F\*, PURE a wp, where in prims.fst, PURE is defined as an F\* primitive effect with a signature as shown below—we'll see much more of the new\_effect syntax as we look at user-defined effects in subsequent chapters; for now, just see it as a reserved syntax in F\* to introduce a computation type constructor.

```
new_effect PURE (a:Type) (w:wp a) { ... }
```

where

```
let pre = Type0
let post (a:Type) = a -> Type0
let wp (a:Type) = post a -> pre
```

A program e of type PURE a wp is a computation which

- Is defined only when wp (fun \_ -> True) is valid
- If wp post is valid, then e terminates without any side effects and returns a value v:a satisfying post v.

Notice that wp a is the type of a function transforming postconditions (a -> Type0) to preconditions (Type0). The wp argument is also called an *index* of the PURE effect.  $^2$ 

The return operator for wp  $\,$ a is shown below: it is analogous to the WP  $\,$ c  $\,$ Q and WP  $\,$ x  $\,$ Q rules for variables and constants that we showed earlier:

```
let cont (r:Type) (a:Type) = (a -> r) -> r // (a -> r) is the continuation
let return #r (#a:Type) (x:a) : cont r a = fun k -> k x
let bind #r (#a #b:Type) (f:cont r a) (g:a -> cont r b)
    : cont r b
    = fun k -> f (fun x -> g x k)
```

If we squint a bit, we can see that the wp monad we defined earlier, is nothing but a continuation into Type0, i.e., wp a = cont Type0 a (or cont prop a, if one prefers to use prop).

 $<sup>^{1}</sup>$  It is also possible to define post  $a = a \rightarrow prop$  and pre = prop. However, the F\* libraries for pure WPs using Type0 instead of prop, so we remain faithful to that here.

<sup>&</sup>lt;sup>2</sup> Dijkstra monads are also related to the continuation monad. Continuation monad models Continuation Passing Style programming, where the control is passed to the callee explicitly in the form of a continuation. For a result type r, the continuation monad is defined as follows:

```
let return_wp (#a:Type) (x:a) : wp a = fun post -> post x
```

The bind operator for wp a is analogous to the rule for sequencing WPs, i.e., the rule for WP (let x = e1 in e2) Q above:

```
let bind_wp (#a #b:Type) (wp1:wp a) (wp2:a -> wp b)
   : wp b
   = fun post -> wp1 (fun x -> wp2 x post)
```

Finally, analogous to the WP rule for conditionals, one can write a combinator for composing wp a in a branch:

```
let if_then_else_wp (#a:Type) (b:bool) (wp1 wp2:wp a)
  : wp a
  = fun post -> if b then wp1 post else wp2 post
```

This is the essence of the Dijkstra monad construction for pure programs: the rule for computing weakest preconditions for a computation *returning* a value x is return\_wp; the rule for computing the WP of the sequential composition of terms is the sequential composition of WPs using bind\_wp; the rule for computing the WP of a conditional term is the conditional composition of WPs using if\_then\_else\_wp.

If fact, if one thinks of pure computations as the identity monad, tot a as shown below:

```
let tot (a:Type) = a
let return_tot (#a:Type) (x:a) : tot a = x
let bind_tot (#a #b:Type) (x:tot a) (y:a -> tot b)
    : tot b
    = let v = x in y v
```

then the parallel between the tot monad and wp becomes even clearer—the WP analog of return\_tot is return\_wp and of bind\_tot is bind\_wp.

It turns out that wp a (for monotonic weakest preconditions) is itself a monad, as shown below by a proof of the monad laws:

(continues on next page)

#### 28.3 PURE and Tot

When typechecking a program, F\* computes a weakest precondition which characterizes a necessary condition for the program to satisfy all its typing constraints. This computed weakest precondition is usually hidden from the programmer, but if you annotate your program suitably, you can get access to it, as shown in the code snippet below:

The type says that square n is a pure function, which for any postcondition q:nat -> prop,

- Is defined only when  $n * n \ge 0$  and when q (n \* n) is valid
- And returns a value m:nat satisfying q m

Let's look at another example:

Notice how the wp index of PURE mirrors the structure of the computation itself—it starts with an if\_then\_else\_wp, then in the first branch, uses a bind\_wp followed by a return; and in the else branch it returns x.

As such, the wp-index simply "lifts" the computation into a specification in a form amenable to logical reasoning, e.g., using the SMT solver. For pure programs this may seem like overkill, since the pure term itself can be reasoned about directly, but when the term contains non-trivial typing constraints, e.g., such as those that arise from refinement type checking, lifting the entire program into a single constraint structures and simplifies logical reasoning.

Of course, one often writes specifications that are more abstract than the full logical lifting of the program, as in the example below, which says that to prove post of the return value, the precondition is to prove post on all y >= x. This is a valid, although weaker, characterization of the function's return value.

```
let maybe_incr2 (b:bool) (x:int)
   : PURE int (as_pure_wp (fun post -> forall (y:int). y >= x ==> post y))
   = if b
    then let y = x + 1 in y
   else x
```

The PURE computation type comes with a built-in weakening rule. In particular, if a term is computed to have type PURE a wp\_a and it is annotated to have type PURE b wp\_b, then F\* does the following:

- 1. It computes a constraint p: a -> Type0, which is sufficient to prove that a is a subtype of b, e.g., is a = int and b = nat, the constraint p is fun (x:int) -> x >= 0.
- 2. Next, it strengthens wp\_a to assert that the returned value validates the subtyping constraints p x, i.e., it builds assert\_wp wp\_a p, where

```
let assert_wp (#a:Type) (w:wp a) (p: a -> Type0)
    : wp (x:a{ p x })
    = fun post -> w (fun (x:a) -> p x /\ post x)
```

3. Finally, it produces the verification condition stronger\_wp #b wp\_b (assert\_wp wp\_a p), where stronger\_wp is defined as shown below:

```
let stronger_wp (#a:Type) (wp1 wp2:wp a) : prop =
  forall post. wp1 post ==> wp2 post
```

That is, for any postcondition post, the precondition post implies the original precondition post as well as the subtyping constraint p post in always sound to require more in the precondition.

Thus, when we have e: PURE a wp in  $F^*$ , the wp is a predicate transformer for e, not necessarily the weakest one.

Of course, even maybe\_incr2 is not particularly idiomatic in F\*. One would usually annotate a program with a refinement type, such as the one below:

```
let maybe_incr_tot (b:bool) (x:int)
   : Tot (y:int { y >= x })
   = if b
    then let y = x + 1 in y
   else x
```

Internally to the compiler, F\* treats Tot t as the following instance of PURE:

```
Tot t = PURE t (fun post -> forall (x:t). post x)
```

Once Tot t is viewed as just an instance of PURE, checking if a user annotation Tot t is stronger than the inferred specification of a term PURE a wp is just as explained before.

#### 28.3.1 Pure: Hoare Triples for PURE

Although specification are easier to *compute* using WPs, they are more natural to read and write when presented as Hoare triples, with a clear separation between precondition and postconditions. Further, when specifications written as Hoare triples naturally induce monotonic WPs.

F\* provides an effect abbreviation called Pure for writing and typechecking Hoare-style specifications for pure programs, and is defined as shown below in prims.fst:

```
effect Pure (a:Type) (req:Type0) (ens:a -> Type0) =
    PURE a (fun post -> req /\ (forall x. ens x ==> post x))
```

The signature of Pure is Pure a req ens, where req is the precondition and ens:a -> Type0 is the postcondition. Using Pure, we can write the factorial function we saw at the top of this chapter—F\* infers a PURE a wp type for it, and relates it to the annotated Pure int req ens type, proving that the latter has a stronger precondition and weaker postcondition.

One may wonder when one should write specifications using the notation  $x:a \rightarrow Pure\ b\ req\ ens\ versus\ x:a\{req\} \rightarrow Tot\ (y:b\ \{\ ens\ y\ \})$ . The two styles are closely related and choosing between them is mostly a matter of taste.

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As you have seen, until this point in the book, we have not used Pure a req ens at all. However, when a function has many pre and postconditions, it is sometimes more convenient to use the Pure a req ens notation, rather than stuffing all the constraints in refinement types.

#### 28.4 GHOST and DIV

Just as PURE is an wp-indexed refinement of Tot, F\* provides two more primitive wp-indexed effects:

- GHOST (a:Type) (w:wp a) is a refinement of GTot a
- DIV (a:Type) (w:wp a) is a refinement of Dv a

That is,  $F^*$  uses the GHOST effect to infer total correctness WPs for ghost computations, where, internally, GTot a is equivalent to GHOST a (fun post -> forall x. post x)

Likewise,  $F^*$  uses the DIV effect to infer *partial correctness* WPs for potentially non-terminating computations, where, internally, Dv a is equivalent to DIV a (fun post -> forall x. post x).

As with Tot and PURE,  $F^*$  automatically relates GTot and GHOST computations, and Dv and DIV computations. Further, the effect ordering Tot < Dv and Tot < GTot extends to PURE < DIV and PURE < GHOST as well.

The prims.fst library also provides Hoare-triple style abbreviations for GHOST and DIV, i.e.,

```
effect Ghost a req ens = GHOST a (fun post -> req /\ (forall x. ens x /\ post x))
effect Div a req ens = DIV a (fun post -> req /\ (forall x. ens x /\ post x))
```

These Hoare-style abbreviations are more convenient to use than their more primitive WP-based counterparts.

The tradeoffs of using Ghost vs. GTot or Div vs. Dv are similar to those for Pure vs Tot—it's mostly a matter of taste. In fact, there are relatively few occurrences of Pure, Ghost, and Div in most F\* codebases. However, there is one important exception: Lemma.

#### 28.5 The Lemma abbreviation

We can finally unveil the definition of the Lemma syntax, which we introduced as a syntactic shorthand in *an early chapter*. In fact, Lemma is defined in prims.fst as follows:

That is, Lemma is an instance of the Hoare-style refinement of pure computations Pure a req ens. So, when you write a proof term and annotate it as e: Lemma (requires pre) (ensures post), F\* infers a specification for e: PURE a wp, and then, as with all PURE computations, F\* tries to check that the annotated Lemma specification has a stronger WP-specification than the computed weakest precondition.

Of course, F\* still includes syntactic sugar for Lemma, e.g., Lemma (requires pre) (ensures post) is desugared to Lemma unit pre (fun \_ -> post) []. The last argument of a lemma, the smt\_pats are used to introduce lemmas to the SMT solver for proof automation—a *later chapter* covers that in detail.

Finally, notice the type of the post, which assumes squash pre as an argument—this is what allows the ensures clause of a Lemma to assume that what was specified in the `requires clause.

# Part VI

# Tactics and Metaprogramming with Meta-F\*

#### This part of the book is still heavily under construction

So far, we have mostly relied on the SMT solver to do proofs in F\*. This works rather well: we got this far, after all! However, sometimes, the SMT solver is really not able to complete our proof, or takes too long to do so, or is not *robust* (i.e. works or fails due to seemingly insignificant changes).

This is what Meta-F\* was originally designed for. It provides the programmer with more control on how to break down a proof and guide the SMT solver towards finding a proof by using *tactics*. Moreover, a proof can be fully completed within Meta-F\* without using the SMT solver at all. This is the usual approach taken in other proof assistants (such as Lean, Coq, or Agda), but it's not the preferred route in F\*: we will use the SMT for the things it can do well, and mostly write tactics to "preprocess" obligations and make them easier for the solver, thus reducing manual effort.

Meta-F\* also allows for *metaprogramming*, i.e. generating programs (or types, or proofs, ...) automatically. This should not be surprising to anyone already familiar with proof assistants and the Curry-Howard correspondence. There are however some slight differences between tactic-based proofs and metaprogramming, and more so in F\*, so we will first look at automating proofs (i.e. tactics), and then turn to metaprogramming (though we use the generic name "metaprogram" for tactics as well).

In summary, when the SMT solver "just works" we usually do not bother writing tactics, but, if not, we still have the ability to roll up our sleeves and write explicit proofs.

Speaking of rolling up our sleeves, let us do just that, and get our first taste of tactics.

of-Oriented Progra	mming in F*		

**CHAPTER** 

#### **TWENTYNINE**

#### AN OVERVIEW OF TACTICS

In this chapter, we quickly introduce several of the main concepts underlying Meta-F\* and its use in writing tactics for proof automation. The goal is to get you quickly up to speed on basic uses of tactics. Subsequent chapters will revisit the concepts covered here in more detail, introduce more advanced aspects of Meta-F\*, and show them at use in several case studies.

## 29.1 Decorating assertions with tactics

As you know already, F\* verifies programs by computing verification conditions (VCs) and calling an SMT solver (Z3) to prove them. Most simple proof obligations are handled completely automatically by Z3, and for more complex statements we can help the solver find a proof via lemma calls and intermediate assertions. Even when using lemma calls and assertions, the VC for a definition is sent to Z3 in one single piece (though *SMT queries can be split via an option.*). This "monolithic" style of proof can become unwieldy rapidly, particularly when the solver is being pushed to its limits.

The first ability Meta-F\* provides is allowing to attach specific tactics to assertions. These tactics operate on the "goal" that we want to prove, and can "massage" the assertion by simplifying it, splitting it into several sub-goals, tweaking particular SMT options, etc.

For instance, let us take the following example, where we want to guarantee that pow2 x is less than one million given that x is at most 19. One way of going about this proof is by noting that pow2 is an increasing function, and that pow2 19 is less than one million, so we try to write something like this:

```
let pow2_bound_19 (x:nat{x <= 19}) : Lemma (pow2 x < 1000000) =
   assert (forall (x y : nat). x <= y ==> pow2 x <= pow2 y);
   assert (pow2 19 == 524288);
   assert (pow2 x < 10000000);
   ()</pre>
```

Sadly, this doesn't work. First of all, Z3 cannot automatically prove that pow2 is increasing, but that is to be expected. We could prove this by a straightforward induction. However, we only need this fact for x and 19, so we can simply call FStar.Math.Lemmas.pow2\_le\_compat from the library:

```
let pow2_bound_19' (x:nat{x <= 19}) : Lemma (pow2 x < 1000000) =
FStar.Math.Lemmas.pow2_le_compat 19 x;
assert (pow2 19 == 524288);
assert (pow2 x < 10000000);
()</pre>
```

Now, the second assertion fails. Z3 will not, with the default fuel limits, unfold pow2 enough times to compute pow2 19 precisely. (You can read more about how F\* uses "fuel" to control the SMT solver's ability to unfold recursive

*definitions*.) Here we will use our first call into Meta-F\*: via the by keyword, we can attach a tactic to an assertion. In this case, we'll ask Meta-F\* to compute() over the goal, simplifying as much as it can via F\*'s normalizer, like this:

```
let pow2_bound_19'' (x:nat{x <= 19}) : Lemma (pow2 x < 1000000) =
   FStar.Math.Lemmas.pow2_le_compat 19 x;
   assert (pow2 19 == 524288) by compute ();
   assert (pow2 x < 10000000);
   ()</pre>
```

Now the lemma verifies! Meta- $F^*$  reduced the proof obligation into a trivial equality. Crucially, however, the pow2 19 == 524288 shape is kept as-is in the postcondition of the assertion, so we can make use of it! If we were just to rewrite the assertion into 524288 == 524288 that would not be useful at all.

How can we know what Meta- $F^*$  is doing? We can use the dump tactic to print the state of the proof after the call to compute().

```
let pow2_bound_19''' (x:nat{x <= 19}) : Lemma (pow2 x < 1000000) =
FStar.Math.Lemmas.pow2_le_compat 19 x;
assert (pow2 19 == 524288) by (compute (); dump "after compute");
assert (pow2 x < 1000000);
()</pre>
```

With this version, you should see something like:

as output from  $F^*$  (or in the goals buffer if you are using emacs with fstar-mode.el). The print primitive can also be useful.

A "goal" is some proof obligation that is yet to be solved. Meta-F\* allows you to capture goals (e.g. via assert..by), modify them (such as with compute), and even to completely solve them. In this case, we can solve the goal (without Z3) by calling trivial(), a helper tactic that discharges trivial goals (such as trivial equalities).

```
let pow2_bound_19'''' (x:nat{x <= 19}) : Lemma (pow2 x < 10000000) =
   FStar.Math.Lemmas.pow2_le_compat 19 x;
   assert (pow2 19 == 524288) by (
     compute ();
     trivial ();
   qed ()
   );
   assert (pow2 x < 10000000);
   ()</pre>
```

If you dump the state just after the trivial() call, you should see no more goals remain (this is what qed() checks).

Note: Meta-F\* does not yet allow a fully interactive style of proof, and hence we need to re-check the entire proof

after every edit. We hope to improve this soon.

There is still the "rest" of the proof, namely that pow2 x < 1000000 given the hypothesis and the fact that the assertion holds. We call this *skeleton* of the proof, and it is (by default) not handled by Meta-F\*. In general, we only use tactics on those assertions that are particularly hard for the SMT solver, but leave all the rest to it.

#### 29.2 The Tac effect

**Note:** Although we have seen a bit about *monads and computational effects in a previous chapter*, we have yet to fully describe F\*'s effect system. So, some of what follows may be a bit confusing. However, you don't need to fully understand how the Tac effect is implemented to use tactics. Feel free to skip ahead, if this section doesn't make much sense to you.

What, concretely, are tactics? So far we've written a few simple ones, without too much attention to their structure.

Tactics and metaprograms in F\* are really just F\* terms, but *in a particular effect*, namely Tac. To construct interesting metaprograms, we have to use the set of *primitives* provided by Meta-F\*. Their full list is in the FStar.Tactics. Builtins module. So far, we have actually not used any primitive directly, but only *derived* metaprograms present in the standard library.

Internally, Tac is implemented via a combination of 1) a state monad, over a proofstate, 2) exceptions and 3) divergence or non-termination. The state monad is used to implicitly carry the proofstate, without us manually having to handle all goals explicitly. Exceptions are a useful way of doing error handling. Any declared exception can be raise'd within a metaprogram, and the try..with construct works exactly as for normal programs. There are also fail, catch and recover primitives.

Metaprograms cannot be run directly. This is needed to retain the soundness of pure computations, in the same way that stateful and exception-raising computations are isolated from the Pure fragment (and from each other). Metaprograms can only be used where F\* expects them, such as in an assert..by construct. Here, F\* will run the metaprogram on an initial proofstate consisting (usually) of a single goal, and allow the metaprogram to modify it.

To guarantee soundness, i.e., that metaprograms do not prove false things, all of the primitives are designed to perform small and correct modifications of the goals. Any metaprogram constructed from them cannot do anything to the proofstate (which is abstract) except modifying it via the primitives.

Having divergence as part of the Tac effect may seem a bit odd, since allowing for diverging terms usually implies that one can form a proof of false, via a non-well-founded recursion. However, we should note that this possible divergence happens at the *meta* level. If we call a divergent tactic, F\* will loop forever waiting for it to finish, never actually accepting the assertion being checked.

As you know, F\* already has exceptions and divergence. All Dv and Ex functions can readily be used in Meta-F\* metaprograms, as well as all Tot and Pure functions. For instance, you can use all of the FStar.List.Tot module if your metaprogram uses lists.

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#### **29.3 Goals**

Essentially, a Meta-F\* tactic manipulates a *proofstate*, which is essentially a set of *goals*. Tactic primitives usually work on the goals, for example by simplifying (like compute()) or by breaking them down into smaller *sub*-goals.

When proving assertions, all of our goals will be of the shape squash phi, where phi is some logical formula we must prove. One way to break down a goal into subparts is by using the mapply tactic, which attempts to prove the goal by instantiating the given lemma or function, perhaps adding subgoals for the hypothesis and arguments of the lemma. This "working backwards" style is very common in tactics frameworks.

For instance, we could have proved the assertion that pow2  $x \le pow2$  19 in the following way:

```
assert (pow2 x <= pow2 19) by (mapply (`FStar.Math.Lemmas.pow2_le_compat));</pre>
```

This reduces the proof of pow2  $x \le pow2$  19 to  $x \le 19$  (the precondition of the lemma), which is trivially provably by Z3 in this context. Note that we do not have to provide the arguments to the lemma: they are inferred by  $F^*$  through *unification*. In a nutshell, this means  $F^*$  finds there is an obvious instantiation of the arguments to make the postcondition of the lemma and the current assertion coincide. When some argument is *not* found via unification, Meta- $F^*$  will present a new goal for it.

This style of proof is more *surgical* than the one above, since the proof that  $pow2 x \le pow2 19$  does not "leak" into the rest of the function. If the proof of this assertion required several auxiliary lemmas, or a tweak to the solver's options, etc, this kind of style can pay off in robustness.

Most tactics works on the *current* goal, which is the first one in the proofstate. When a tactic reduces a goal g into  $g1, \ldots, gn$ , the new  $g1, \ldots, gn$  will (usually) be added to the beginning of the list of goals.

In the following simplified example, we are looking to prove s from p given some lemmas. The first thing we do is apply the  $qr_s$  lemma, which gives us two subgoals, for q and r respectively. We then need to proceed to solve the first goal for q. In order to isolate the proofs of both goals, we can focus on the current goal making all others temporarily invisible. To prove q, we then just use the  $p_r$  lemma and obtain a subgoal for p. This one we will just just leave to the SMT solver, hence we call smt() to move it to the list of SMT goals. We prove r similarly, using  $p_r$ .

```
assume val p : prop
assume val q : prop
assume val r : prop
assume val s : prop
assume val p_q: unit -> Lemma (requires p) (ensures q)
assume val p_r : squash p -> Lemma r
assume val qr_s : unit \rightarrow Lemma (q ==> r ==> s)
let test () : Lemma (requires p) (ensures s) =
  assert s by (
    mapply (`qr_s);
    focus (fun () ->
      mapply (p_q);
      smt());
    focus (fun () ->
      mapply (`p_r);
      smt());
    ()
  )
```

Once this tactic runs, we are left with SMT goals to prove p, which Z3 discharges immediately.

Note that mapply works with lemmas that ensure an implication, or that have a precondition (requires/ensures), and even those that take a squashed proof as argument. Internally, mapply is implemented via the apply\_lemma and apply primitives, but ideally you should not need to use them directly.

Note, also, that the proofs of each part are completely isolated from each other. It is also possible to prove the p\_gives\_s lemma by calling the sublemmas directly, and/or adding SMT patterns. While that style of proof works, it can quickly become unwieldy.

#### 29.4 Quotations

In the last few examples, you might have noted the backticks, such as in (`FStar.Math.Lemmas.pow2\_le\_compat). This is a *quotation*: it represents the *syntax* for this lemma instead of the lemma itself. It is called a quotation since the idea is analogous to the word "sun" being syntax representing the sun.

A quotation always has type term, an abstract type representing the AST of F\*.

Meta- $F^*$  also provides *antiquotations*, which are a convenient way of modifying an existing term. For instance, if t is a term, we can write `(1 + `#t) to form the syntax of "adding 1" to t. The part inside the antiquotation (`#) can be anything of type term.

Many metaprogramming primitives, however, do take a term as an argument to use it in proof, like apply\_lemma does. In this case, the primitives will typecheck the term in order to use it in proofs (to make sure that the syntax actually corresponds to a meaningful well-typed F\* term), though other primitives, such as term\_to\_string, won't typecheck anything.

We will see ahead that quotations are just a convenient way of constructing syntax, instead of doing it step by step via pack.

## 29.5 Basic logic

Meta-F\* provides some predefined tactics to handle "logical" goals.

For instance, to prove an implication p ==> q, we can "introduce" the hypothesis via implies\_intro to obtain instead a goal for q in a context that assumes p.

For experts in Coq and other provers, this tactic is simply called intro and creates a lambda abstraction. In F\* this is slightly more contrived due to squashed types, hence the need for an implies\_intro different from the intro, explained ahead, that introduces a binder.

Other basic logical tactics include:

- forall\_intro: for a goal forall x. p, introduce a fresh x into the context and present a goal for p.
- 1\_intros: introduce both implications and foralls as much as possible.
- split: split a conjunction (p /\ q) into two goals
- left/right: prove a disjunction p \/ q by proving p or q
- assumption: prove the goal from a hypothesis in the context.
- pose\_lemma: given a term t representing a lemma call, add its postcondition to the context. If the lemma has a precondition, it is presented as a separate goal.

See the FStar.Tactics.Logic module for more.

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## 29.6 Normalizing and unfolding

We have previously seen compute(), which blasts a goal with F\*'s normalizer to reduce it into a *normal form*. We sometimes need a bit more control than that, and hence there are several tactics to normalize goals in different ways. Most of them are implemented via a few configurable primitives (you can look up their definitions in the standard library)

- compute(): calls the normalizer with almost all steps enabled
- simpl(): simplifies logical operations (e.g. reduces p /\ True to p).
- whnf() (short for "weak head normal form"): reduces the goal until its "head" is evident.
- unfold\_def `t: unfolds the definition of the name t in the goal, fully normalizing its body.
- trivial(): if the goal is trivial after normalization and simplification, solve it.

The norm primitive provides fine-grained control. Its type is list norm\_step -> Tac unit. The full list of norm\_step s can be found in the FStar.Pervasives module, and it is the same one available for the norm marker in Pervasives (beware of the name clash between Tactics.norm and Pervasives.norm!).

## 29.7 Inspecting and building syntax

As part of automating proofs, we often need to inspect the syntax of the goal and the hypotheses in the context to decide what to do. For instance, instead of blindly trying to apply the split tactic (and recovering if it fails), we could instead look at the *shape* of the goal and apply split only if the goal has the shape p1 /\ p2.

Note: inspecting syntax is, perhaps obviously, not something we can just do everywhere. If a function was allowed to inspect the syntax of its argument, it could behave differently on 1+2 and 3, which is bad, since 1+2 == 3 in  $F^*$ , and functions are expected to map equal arguments to the same result. So, for the most part, we cannot simply turn a value of type a into its syntax. Hence, quotations are *static*, they simply represent the syntax of a term and one cannot turn values into terms. There is a more powerful mechanism of *dynamic quotations* that will be explained later, but suffice it to say for now that this can only be done in the Tac effect.

As an example, the cur\_goal() tactic will return a value of type typ (an alias for term indicating that the term is really the representation of an F\* type) representing the syntax of the current goal.

The term type is *abstract*: it has no observable structure itself. Think of it as an opaque "box" containing a term inside. A priori, all that can be done with a term is pass it to primitives that expect one, such as tc to type-check it or norm\_term to normalize it. But none of those give us full, programatic access to the structure of the term.

That's where the term\_view comes in: following a classic idea introduced by Phil Wadler, there is function called inspect that turns a term\_into a term\_view. The term\_view type resembles an AST, but crucially it is not recursive: its subterms have type term rather than term\_view.

Listing 1: Part of the term\_view type.

```
noeq
type term_view =
    | Tv_FVar : v:fv -> term_view
    | Tv_App : hd:term -> a:argv -> term_view
    | Tv_Abs : bv:binder -> body:term -> term_view
    | Tv_Arrow : bv:binder -> c:comp -> term_view
    | Tv_Arrow : bv:binder -> c:comp -> term_view
```

The inspect primitves "peels away" one level of the abstraction layer, giving access to the top-level shape of the term.

The Tv\_FVar node above represents (an ocurrence of) a global name. The fv type is also abstract, and can be viewed as a name (which is just list string) via inspect\_fv.

For instance, if we were to inspect  $\qr_s$  (which we used above) we would obtain a  $\qr_s$  v, where  $\qr_s$  is something like ["Path"; "To"; "Module"; " $\qr_s$ "], that is, an "exploded" representation of the fully-qualified name Path. To. Module.  $\qr_s$ .

Every syntactic construct (terms, free variables, bound variables, binders, computation types, etc) is modeled abstractly like term and fv, and has a corresponding inspection functions. A list can be found in FStar.Reflection.Builtins.

If the inspected term is an application, inspect will return a Tv\_App f a node. Here f is a term, so if we want to know its structure we must recursively call inspect on it. The a part is an *argument*, consisting of a term and an argument qualifier (aqualv). The qualifier specifies if the application is implicit or explicit.

Of course, in the case of a nested application such as f x y, this is nested as (f x) y, so inspecting it would return a  $Tv\_App$  node containing f x and g y (with a  $g\_Explicit$  qualifier). There are some helper functions defined to make inspecting applications easier, like  $collect\_app$ , which decompose a term into its "head" and all of the arguments the head is applied to.

Now, knowing this, we would then like a function to check if the goal is a conjunction. Naively, we need to inspect the goal to check that it is of the shape squash ((/\) a1 a2), that is, an application with two arguments where the head is the symbol for a conjunction, i.e. (/\). This can already be done with the term\_view, but is quite inconvenient due to there being *too much* information in it.

Meta-F\* therefore provides another type, formula, to represent logical formulas more directly. Hence it suffices for us to call term\_as\_formula and match on the result, like so:

```
(* Check if a given term is a conjunction, via term_as_formula. *)
let isconj_t (t:term) : Tac bool =
  match term_as_formula t with
  | And _ _ -> true
  | _ -> false

(* Check if the goal is a conjunction. *)
let isconj () : Tac bool = isconj_t (cur_goal ())
```

The term\_as\_formula function, and all others that work on syntax, are defined in "userspace" (that is, as library tactics/metaprograms) by using inspect.

Listing 2: Part of the formula type.

```
noeq
type formula =
    | True_ : formula
    | False_ : formula
    | And : term -> term -> formula
    | Or : term -> term -> formula
    | Not : term -> formula
    | Implies: term -> term -> formula
    | Forall : bv -> term -> formula
```

**Note:** For experts: F\* terms are (internally) represented with a locally-nameless representation, meaning that variables do not have a name under binders, but a de Bruijn index instead. While this has many advantages, it is likely to be counterproductive when doing tactics and metaprogramming, hence inspect *opens* variables when it traverses a binder, transforming the term into a fully-named representation. This is why inspect is effectul: it requires freshness

to avoid name clashes. If you prefer to work with a locally-nameless representation, and avoid the effect label, you can use inspect\_ln instead (which will return Tv\_BVar nodes instead of Tv\_Var ones).

Dually, a term\_view can be transformed into a term via the pack primitive, in order to build the syntax of any term. However, it is usually more comfortable to use antiquotations (see above) for building terms.

### 29.8 Usual gotchas

- The smt tactic does *not* immediately call the SMT solver. It merely places the current goal into the "SMT Goal" list, all of which are sent to the solver when the tactic invocation finishes. If any of these fail, there is currently no way to "try again".
- If a tactic is natively compiled and loaded as a plugin, editing its source file may not have any effect (it depends on the build system). You should recompile the tactic, just delete its object file, or use the F\* option --no\_plugins to run it via the interpreter temporarily,
- When proving a lemma, we cannot just use \_ by ... since the expected type is just unit. Workaround: assert the postcondition again, or start without any binder.

## 29.9 Coming soon

- Metaprogramming
- · Meta arguments and typeclasses
- Plugins (efficient tactics and metaprograms, --codegen Plugin and --load)
- Tweaking the SMT options
- · Automated coercions inspect/pack
- e <: C by ...
- Tactics can be used as steps of calc proofs.
- Solving implicits (Steel)

## **Part VII**

Pulse: Proof-oriented Programming in Concurrent Separation Logic

Many F\* projects involve building domain-specific languages with specialized programming and proving support. For example, Vale supports program proofs for a structured assembly language; Low\* provides effectful programming in F\* with a C-like memory model; EverParse is a DSL for writing low-level parsers and serializers. Recently, F\* has gained new features for building DSLs embedded in F\* with customized syntax, type checker plugins, extraction support, etc., with *Pulse* as a showcase example of such a DSL.

Pulse is a new programming language embedded in F\*, inheriting many of its features (notably, it is higher order and has dependent types), but with built-in support for programming with mutable state and concurrency, with specifications and proofs in Concurrent Separation Logic.

As a first taste of Pulse, here's a function to increment a mutable integer reference.

```
fn incr (x:ref int)
  requires pts_to x 'i
  ensures pts_to x ('i + 1)
{
    let v = !x;
    x := v + 1;
}
```

And here's a function to increment two references in parallel.

You may not have heard about separation logic before—but perhaps these specifications already make intuitive sense to you. The type of incr says that if "x points to 'i" initially, then when incr returns, "x points to 'i + 1"; while  $par_i$  incr increments the contents of x and y in parallel by using the  $par_i$  combinator.

Concurrent separation logic is an active research area and there are many such logics to use, all with different tradeoffs. The state of the art in concurrent separation logic is Iris, a higher-order, impredicative separation logic. Drawing inspiration from Iris, Pulse's logic is similar in many ways to Iris, but is based on a logic called PulseCore, formalized entirely within F\*—you can find the formalization here. Proofs of programs in Pulse's surface language correspond to proofs of correctness in the PulseCore program logic. But, you should not need to know much about how the logic is formalized to use Pulse effectively. We'll start from the basics and explain what you need to know about concurrent separation logic to start programming and proving in Pulse. Additionally, Pulse is an extension of F\*, so all you've learned about F\*, lemmas, dependent types, refinement types, etc. will be of use again.

**Note:** Why is it called Pulse? Because it grew from a prior logic called Steel, and one of the authors and his daughter are big fans of a classic reggae band called Steel Pulse. We wanted a name that was softer than Steel, and, well, a bit playful. So, Pulse!

P	roo	f-C	)riei	nted	Pro	ogra	mm	ina	in	F*

**CHAPTER** 

THIRTY

## **GETTING UP AND RUNNING WITH CODESPACES**

There are three main ways of running Pulse, roughly sorted in increasing order of difficulty.

The easiest way of using Pulse is with Github Codespaces. With a single click, you can get a full-fledged IDE (VS Code) running in your browser already configured with F\* and Pulse.

You can also run Pulse inside a container locally, for a similar 1-click setup that is independent of Github.

Finally, you can also extract a Pulse release tarball and run the binaries directly in your system.

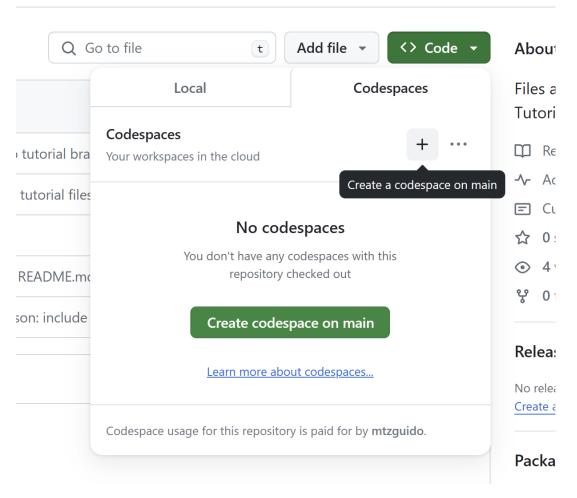
(Building from source is not well-documented yet.)

**Note:** Unlike the pure  $F^*$  parts of this tutorial, Pulse code does not yet work in the online playground. Use one of the methods described below to try the examples in this part of the book.

You can find all the source files associated with each chapter in this folder, in files named PulseTutorial.\*.fst.

# 30.1 Creating a Github Codespace

To do so, go to the this repository and click on the '<>Code' button, then select 'Create codespace on main'. This will use the Dev Container definition in the .devcontainer directory to set up container where  $F^*$  and Pulse can run in a reproducible manner.



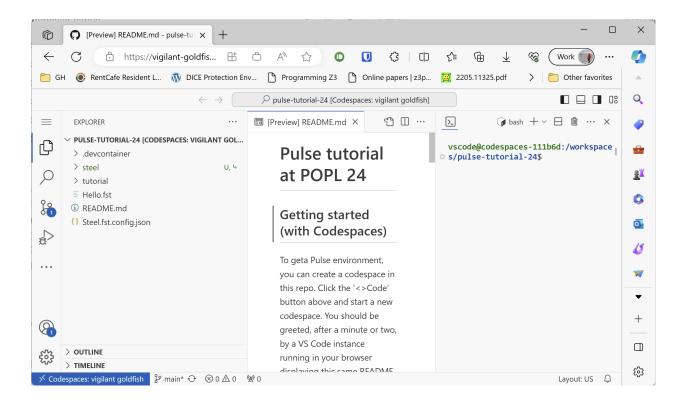
You should be greeted, after a minute or two, by a VS Code instance running in your browser displaying this same README.

# Setting up your codespace

```
✓ Image found.

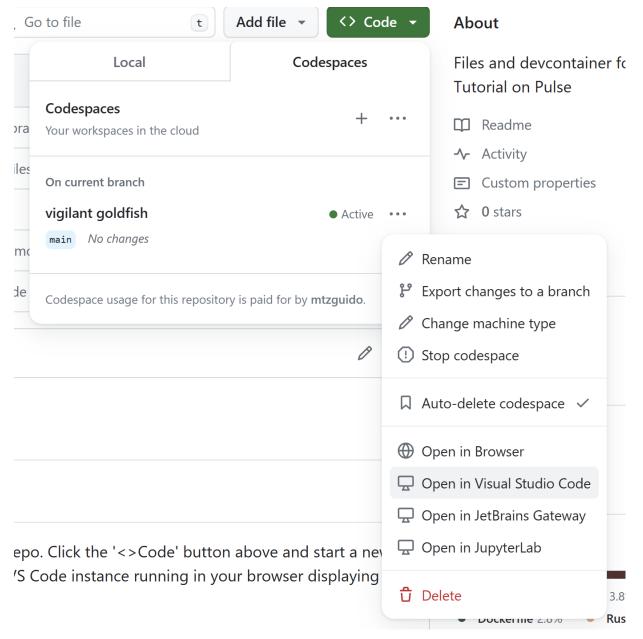
# Building container...
```

Tip See your application running with port forwarding. Learn more



All the usual F\* navigation commands should work on Pulse files.

If you prefer a local UI instead of a browser tab, you can "open" the Codespace from your local VS Code installation like so:



F\* and Pulse are still running on Github's servers, so the usage is still computed, but you may find the UI more comfortable.

# 30.2 Running the Dev Container locally

The Dev Container configuration contains all that is needed to run Pulse in an isolated, reproducible manner. If you would like to avoid Codespaces and just run locally, VS Code can set up the Dev Container locally for you very easily.

Simply open the repository in VS Code. You should see a popup claiming that the project has a Dev Container. Choose 'Reopen in Dev Container' to trigger a build of the container. VS Code will spawn a new window to download the base Docker image, set up the extension in it, and open the repository again.

This new window should now work as usual.

# 30.3 Using a Pulse release

A release of Pulse, including related  $F^*$  tools, is available here. Uncompress the archive and add follow the instructions in the README.md, notably setting the recommended environment variables.

We also recommend installing VS Code and the fstar-vscode-assistant, from the VS Code marketplace. This should pick up the  $F^*$  and Pulse installation from your path.

**CHAPTER** 

### **THIRTYONE**

### **PULSE BASICS**

A Pulse program is embedded in an  $F^*$  program by including the directive #lang-pulse in an  $F^*$  file. The rest of the file can then use a mixture of Pulse and  $F^*$  syntax, as shown below.

```
#lang-pulse
let fstar_five : int = 5

fn five ()
  requires emp
  returns n:int
  ensures pure (n == 5)
{
    fstar_five
}

let pulse_five_in_fstar = five ()
```

This program starts with a bit of regular F\* defining fstar\_five followed by an a Pulse function five that references that F\* definition and proves that it always returns the constant 5. Finally, we have a bit of regular F\* referencing the five defined in Pulse. This is a really simple program, but it already illustrates how Pulse and F\* interact in both directions.

In what follows, unless we really want to emphasize that a fragment of code is Pulse embedded in a larger F\* context, we just assume that we're working in a context where #lang-pulse is enabled.

# 31.1 A Separation Logic Primer

Separation Logic was invented by John Reynolds, Peter O'Hearn, and others in the late 1990s as a way to reason about imperative programs that use shared, mutable data structures, e.g., linked lists and graphs—see this paper for an introduction to separation logic. In the subsequent decades, several innovations were added to separation logic by many people, generalizing it beyond just sequential heap-manipulating programs to distributed programs, concurrent programs, asynchronous programs, etc. that manipulate abstract resources of various kinds, including time and space, messages sent over communication channels, etc.

Much like other Hoare Logics, which we reviewed in an earlier section, separation logic comes in two parts.

**Separation Logic Propositions** First, we have a language of propositions that describe properties about program resources, e.g., the heap. These propositions have the type slprop in Pulse, and, under the covers in the PulselCore semantics of Pulse, a slprop = state -> prop, where state represents the state of a program, e.g., the contents

of memory. It is useful (at least at first) to think of a slprop as a memory property, though we will eventually treat it more abstractly and use it to model many other kinds of resources.

Separation Logic Hoare Triples To connect slprop's to programs, separation logics use Hoare triples to describe the action of a program on its state. For example, the Hoare triple  $\{p\} c \{n, q\}$  describes a program c which when run in an initial state s0 satisfying p s0 (i.e., p is a precondition); c returns a value n while transforming the state to s1 satisfying q n s1 (i.e., q is a postcondition). Pulse's program logic is a partial-correctness logic, meaning that c may also loop forever, deadlock with other threads, etc.

### Some simple slprops and triples: Here are two of the simplest

slprops (defined in Pulse.Lib.Pervasives):

- emp, the trivial proposition (equivalent to fun s -> True).
- pure p, heap-independent predicate fun s -> p. emp is equivalent to pure True.

The type of the program five illustrates how these slprop's are used in program specifications:

- It is a function with a single unit argument—Pulse functions use the keyword fn.
- The precondition is just emp, the trivial assertion in separation logic, i.e., five can be called in any initial state.
- The return value is an integer n:int
- The postcondition may refer to the name of the return value (n in this case) and here claims that the final state satisfies the pure proposition, n == 5.

In other words, the type signature in Pulse is a convenient way to write the Hoare triple  $\{ emp \}$  five  $() \{ n:int. pure (n == 5) \}.$ 

Ownership At this point you may wonder if the postcondition of five is actually strong enough. We've only said that the return value n = 5 but have not said anything about the state that results from calling five (). Perhaps this specification allows five to arbitrarily change any memory location in the state, since pure (5 == 5) is true of any state. If you're familiar with Low\*, Dafny, or other languages based on Hoare logic for heaps, you may be wondering about how come we haven't specified a modifies-clause, describing exactly which part of the state a function may have changed. The nice thing in separation logic is that there is no need to describe what parts of the state you may have modified. This is because a central idea in logic is the concept of *ownership*. To a first approximation, a computation can only access those resources that it is explicitly granted access to in its precondition or those that it creates itself. In this case, with a precondition of emp, the function five does not have permission to access *any* resources, and so five simply cannot modify the state in any observable way.

**Separating Conjunction and the Frame Rule** Let's go back to incr and par\_incr that we saw in the previous section and look at their types closely. We'll need to introduce two more common slprop's, starting with the "pointsto" predicate:

• pts\_to x v asserts that the reference x points to a cell in the current state that holds the value v.

slprop's can also be combined in various ways, the most common one being the "separating conjunction", written \*\* in Pulse.<sup>3</sup>

- p \*\* q, means that the state can be split into two *disjoint* fragments satisfying p and q, respectively. Alternatively, one could read p \*\* q as meaning that one holds the permissions associated with both p and q separately in a given state. The \*\* operator satisfies the following laws:
  - Commutativity: p \*\* q is equivalent to q \*\* p
  - Associativity: p \*\* (q \*\* r) is equivalent to (p \*\* q) \*\* r

<sup>&</sup>lt;sup>1</sup> For experts, Pulse's separation logic is *affine*.

<sup>&</sup>lt;sup>2</sup> When we get to things like invariants and locks, we'll see how permissions can be acquired by other means.

 $<sup>^3</sup>$  In the separation logic literature, separating conjunction is written p \* q, with just a single star. We use two stars \*\* to avoid a clash with multiplication.

Left and right unit: p \*\* emp is equivalent to p. Since \*\* is commutative, this also means that emp \*\* p is equivalent to p

Now, perhaps the defining characteristic of separation logic is how the \*\* operator works in the program logic, via a key rule known as the *frame* rule. The rule says that if you can prove the Hoare triple  $\{p\}$  c  $\{n, q\}$ , then, for any other f: slprop, you can also prove  $\{p^* f\}$  c  $\{n, q^* f\}$ —f is often called the "frame". It might take some time to appreciate, but the frame rule captures the essence of local, modular reasoning. Roughly, it states that if a program is correct when it only has permission p on the input state, then it remains correct when run in a larger state and is guaranteed to preserve any property (f) on the part of the state that it doesn't touch.

With this in mind, let's look again at the type of incr, which requires permission only to x and increments it:

```
fn incr (x:ref int)
  requires pts_to x 'i
  ensures pts_to x ('i + 1)
{
    let v = !x;
    x := v + 1;
}
```

Because of the frame rule, we can also call incr in a context like incr\_frame below, and we can prove without any additional work that y is unchanged.

```
fn incr_frame (x y:ref int)
requires pts_to x 'i ** pts_to y 'j
ensures pts_to x ('i + 1) ** pts_to y 'j
{
   incr x;
}
```

In fact, Pulse lets us use the frame rule with any f:slprop, and we get, for free, that incr x does not disturb f.

```
fn incr_frame_any (x:ref int) (f:slprop)
requires pts_to x 'i ** f
ensures pts_to x ('i + 1) ** f
{
  incr x;
}
```

A point about the notation: The variable 'i is an implicitly bound logical variable, representing the value held in the ref-cell x in the initial state. In this case, 'i has type FStar.Ghost.erased int—we learned about *erased types in a previous section*. One can also bind logical variables explicitly, e.g., this is equivalent:

```
fn incr_explicit_i (x:ref int) (i:erased int)
requires pts_to x i
ensures pts_to x (i + 1)
{
    let v = !x;
    x := v + 1;
}
```

**Other slprop connectives** In addition the separating conjunction, Pulse, like other separation logics, provides other ways to combine slprops. We'll look at these in detail in the subsequent chapters, but we list the most common other connectives below just to give you a taste of the logic.

• exists\* (x1:t1) ... (xn:tn). p: Existential quantification is used extensively in the Pulse libraries, and

the language provides many tools to make existentials convenient to use. exists x. p is valid in a state s if there is a witness w such that p [w/x] is valid in s. For experts, existential quantification is impredicative, in the sense that one can quantify over s-props themselves, i.e., exists\* (p:s-prop). q is allowed.

- forall\* (x1:t1) ... (xn:tn). p: Universal quantification is also supported, though less commonly used. forall (x:t). p is valid in s if p[w/x] is valid for all values w:t. Like existential quantification, it is also impredicative.
- p @==> q is a form of separating implication similar to an operator called a *magic wand* or a *view shift* in other separation logics.

Pulse does not yet provide libraries for conjunction or disjunction. However, since Pulse is embedded in F\*, new slprops can also be defined by the user and it is common to do so, e.g., recursively defined predicates, or variants of the connectives described above.

**CHAPTER** 

### **THIRTYTWO**

### **MUTABLE REFERENCES**

Pulse aims to support programming with explicit control over memory management and without need for a garbage collector, similar to languages like C or Rust, but, of course, in a proof-oriented style. Towards that end, one of the main features it offers (especially in comparison to purely functional F\*) is support for references to mutable memory that can be both allocated and reclaimed.

In this chapter, we'll learn about three kinds of mutable references: stack references, heap references (or boxes), and ghost references. Stack references point to memory allocated in the stack frame of the current function (in which case the memory is reclaimed when the function returns). Heap references, or boxes, point to memory locations in the heap, and heap memory is explicitly reclaimed by calling drop or free. Ghost references are for specification and proof purposes only and point to memory locations that do not really exist at runtime.

# 32.1 ref t: Stack or Heap References

Most of the operations on mutable references are agnostic to whether the memory referenced resides on the stack or the heap—the main difference is that stack references are allocated in a scope and implicitly reclaimed when they go out of scope; whereas heap references are explicitly allocated and deallocated.

The type Pulse.Lib.Reference.ref t is the basic type of a mutable reference. We have already seen ref t used in the incr function of the previous section. We show below another common function to swap the contents of two references:

```
fn swap #a (r0 r1:ref a)
requires pts_to r0 'v0 ** pts_to r1 'v1
ensures pts_to r0 'v1 ** pts_to r1 'v0
{
    let v0 = !r0;
    let v1 = !r1;
    r0 := v1;
    r1 := v0;
}
```

### 32.1.1 Reading a reference

Let's start by taking a closer look at how dereferencing works in the function value\_of below:

```
fn value_of (#a:Type) (r:ref a)
requires pts_to r 'v
returns v:a
ensures pts_to r 'v ** pure (v == 'v)
{
    !r;
}
```

Its slightly more explicit form is shown below, where w:erased a is an erased value witnessing the current contents referenced by r.

```
fn value_of_explicit (#a:Type) (r:ref a) (#w:erased a)
requires pts_to r w
returns v:a
ensures pts_to r w ** pure (v == reveal w)
{
    !r;
}
```

Notice how the precondition requires  $pts_to r w$  while the postcondition retains  $pts_to r w$ , along with the property that v == reveal w, i.e., the type proves that if we read the reference the value we get is equal to the logical witness provided.

# 32.1.2 Erased values are for specification and proof only

The logical witness is an erased value, so one cannot directly use it in a non-ghost computation. For example, if instead of reading the reference, we attempt to just return reveal w, the code fails to check with the error shown below.

```
fn value_of_explicit_fail (#a:Type) (r:ref a) (#w:erased a)
requires pts_to r w
returns v:a
ensures pts_to r w ** pure (v == reveal w)
{
    reveal w
}
```

```
Expected a Total computation, but got Ghost
```

### 32.1.3 Writing through a reference

The function  $assign\ below\ shows\ how\ to\ mutate\ the\ contents\ of\ a\ reference—the\ specification\ shows\ that\ when\ the\ function\ returns,\ r\ points\ to\ the\ assigned\ value\ v.$ 

```
fn assign (#a:Type) (r:ref a) (v:a)
requires pts_to r 'v
ensures pts_to r v
{
    (continues on next page)
```

```
r := v;
}
```

## 32.1.4 Dereferencing is explicit

Unlike languages like C or Rust which make a distinction between l-values and r-values and implicitly read the content of references, in Pulse (like in OCaml), references are explicitly dereferenced. As the program below illustrates, references themselves can be passed to other functions (e.g., as in/out-parameters) while their current values must be passed explicitly.

The function add takes both a reference r:ref int and a value n:int as arguments:

```
fn add (r:ref int) (n:int)
  requires pts_to r 'v
  ensures pts_to r ('v + n)
{
    let v = !r;
    r := v + n;
}
```

Meanwhile, the function quadruple calls add twice to double the value stored in r each time.

```
fn quadruple (r:ref int)
  requires pts_to r 'v
  ensures pts_to r (4 * 'v)
{
    let v1 = !r;
    add r v1;
    let v2 = !r;
    add r v2;
}
```

## 32.1.5 Inspecting the proof state

A Pulse program is checked one stateful operation at a time, "pushing through" the slprop assertions starting with the precondition, until the end of function's body. The inferred slprop at the exit of a function must match the annotated postcondition. Along the way, the Pulse checker will make several calls to the SMT solver to prove that, say, pts\_to x (v + v) is equal to pts\_to x (2 \* v).

At each point in the program, the Pulse checker maintains a proof state, which has two components:

- A typing environment, binding variables in scope to their types, including some refinement types that reflect properties about those variables in scope, e.g., x:int; y:erased int; \_:squash (x == reveal y).
- A separation logic context, called just "the context", or sometimes "the slprop context". The context contains all known facts about the current state of the program.

Pulse provides a command called show\_proof\_state that allows the user to inspect the proof state at a particular program point, aborting the Pulse checker at that point. It's quite common when developing a Pulse program to repeatedly inspect the proof state and to advance it by a single or just a few steps at a time. This makes the experience of developing a Pulse program quite interactive, similar perhaps to writing tactics in F\* or other languages. Except, in Pulse, one incrementally writes an imperative program together with its proof of correctness.

Here below is the quadruple program again, with the proof states annotated at each point, and a show\_proof\_state command in the middle.

The output from show\_proof\_state is shown below:

```
- Current context:
   pts_to r (reveal (hide v1) + v1) **
   emp
- In typing environment:
   [_#5 : unit,
   _#4 : squash (reveal 'v == v1),
   v1#3 : int,
   'v#2 : erased int,
   r#1 : ref int]
```

The comments show how the proof state evolves after each command.

- Pulse typechecks each step of a program by checking the current assumptions in the proof state are sufficient to prove the precondition of that step, ensuring that all unused permissions are retained in the context—using the frame rule, discussed in the previous section. Given a context that is equivalent to p \*\* q, if p is sufficient to prove goal, then p is called *the support* for goal, while q is the *frame*.
- Like F\*, Pulse tries to instantiate implicit arguments automatically, e.g., at the second call to add, Pulse automatically instantiates 'v to v2.
- Pulse automatically moves any pure p property in the slprop context to a squash p hypothesis in the typing environment. Pulse also proves pure properties automatically, by sending queries to the SMT solver, which can make use of the hypothesis in the typing environment only.
- Pulse also uses the SMT solver to convert pts\_to r (v2 + v2) to pts\_to r (4 \* 'v).

## 32.1.6 Stateful commands are explicitly sequenced

Pulse expects the results of all stateful operations to be explicitly let-bound. For example, the following code fails to type check:

```
fn quad_fail (r:ref int)
  requires pts_to r 'v
  ensures pts_to r (4 * 'v)
{
    add r (!r);
    add r (!r);
}
```

The error points to the first occurrence of (!r). The message is admittedly cryptic and should be improved. As we'll see in a later chapter, the type stt \_ \_ \_ is the type of an unevaluated Pulse computation—this error complains that add expected an argument of type int but instead got an unevaluated computation.

#### 32.1.7 Fractional Permissions

Pulse distinguishes read-only references from read/write references. As in languages like Rust, Pulse ensures that there can be at most one thread that holds read/write permission to a reference, although many threads can share read-only references. This ensures that Pulse programs are free of data races. At a more abstract level, Pulse's permission system ensures that one can reason locally about the contents of memory, since if one holds read/write permission to a reference, one can be sure that its contents cannot be changed by some part of the program.

To implement this permission discipline, Pulse uses a system of fractional permissions, an idea due to John Boyland. In particular, the pts\_to predicate that we have been using actually has an additional implicit arguments that describes how much permission one holds on a reference.

The full type of the pts\_to predicate is shown below:

```
val pts_to (#a:Type u#0) (r:ref a) (#p:perm) (v:a) : slprop
```

We have so far been writing pts\_to r v instead of pts\_to #a r #p v. Usually, one does not need to write the first argument #a since it is computed by type inference; the #p:perm argument is more interesting—when omitted, it defaults to the value 1.0R. The type perm (defined in PulseCore.FractionalPermission) is a real number strictly greater than 0.0R and less than or equal to 1.0R.

The pts\_to r #1.0R v represents exclusive, read/write permission on a reference. Revisiting the assign function from previously, we can write down the permissions explicitly.

```
fn assign_full_perm (#a:Type) (r:ref a) (v:a)
requires pts_to r #1.0R v
ensures pts_to r #1.0R v
{
    r := v;
}
```

In contrast, when reading a reference, any permission p will do, as shown below:

```
fn value_of_perm #a #p (r:ref a)
requires pts_to r #p 'v
returns v:a
ensures pts_to r #p 'v ** pure (v == 'v)
{
    !r;
}
```

If we try to write to a reference without holding full permission on it, Pulse rejects the program, as shown below.

```
[@@expect_failure] (continues on next page)
```

```
fn assign_perm #a #p (r:ref a) (v:a) (#w:erased a)
requires pts_to r #p w
ensures pts_to r #p w
{
    r := v;
}
```

```
- Cannot prove:

pts_to #a r #1.0R (reveal #a _)

In the context:

pts_to #a r #p (reveal #a w)
```

The full error message requires the F\* option --print\_implicits.

The functions share and gather allow one to divide and combine permissions on references, as shown below.

```
fn share_ref #a #p (r:ref a)
requires pts_to r #p 'v
ensures pts_to r #(p /. 2.0R) 'v ** pts_to r #(p /. 2.0R) 'v
{
    share r;
}
```

```
fn gather_ref #a (#p:perm) (r:ref a)
requires
   pts_to r #(p /. 2.0R) 'v0 **
   pts_to r #(p /. 2.0R) 'v1
ensures
   pts_to r #p 'v0 **
   pure ('v0 == 'v1)
{
   gather r
}
```

The type of gather\_ref has an additional interesting element: its postcondition proves that v0 = v1. That is, since x can point to at most one value, given two separate points-to assertions about x, allows one to conclude that the pointed-to witnesses are identical.

## 32.2 Stack references

### 32.2.1 let mut creates a new stack ref

To create a new ref t, one uses the let mut construct of Pulse, as shown below.

(continues on next page)

The body of the program is annotated to show program assertions that are true after each command.

- Initially, only the precondition emp is valid.
- After let mut i = 0, we have i : ref int and pts\_to i 0, meaning that i points to a stack slot that holds the value 0.
- After calling incr i, we have pts\_to i (0 + 1)
- Finally, we dereference i using !i and return v:int the current value of i.
- At the point where the scope of a let mut x ends, the Pulse checker requires that the context contains pts\_to x #1.0R \_v for some value \_v. This ensures that the code cannot squirrel away a permission to the soon-to-be out-of-scope reference in some other permission. Once the scope ends, and the memory it points to is reclaimed, and the pts\_to x #1.0R \_v is consumed.

A few additional points to note here:

- Pulse proves pure properties automatically, by sending queries to the SMT solver.
- Pulse simplifies slprop implicitly, e.g., Pulse will automatically rewrite emp \*\* p to p.
- Like F\*, Pulse tries to instantiate implicit arguments automatically, e.g., at the call to incr, Pulse automatically instantiates 'v to 0 (actually, to hide 0).

# 32.2.2 Stack references are scoped and implicitly reclaimed

To emphasize that stack references allocated with let mut are scoped, let's look at the program below that Pulse refuses to check:

```
fn refs_are_scoped ()
requires emp
returns s:ref int
ensures pts_to s 0
{
    let mut s = 0;
    s
}
```

The error points to the location of s with the message below, meaning that the current assertion on the heap is only emp, while the goal to be proven for the postcondition is pts\_to s 0. In other words, we no longer have ownership on s once it goes out of scope.

```
- Cannot prove:
   pts_to s 0
- In the context:
   emp
```

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## 32.3 Heap references

The type Pulse.Lib.Box.box t is the type of heap references—the name is meant to evoke Rust's type of heap references, Box<T>. We use the module alias Box in what follows:

```
module Box = Pulse.Lib.Box
```

The Box module provides most of the same predicates and functions that we have with regular references, including pts\_to, (!), (:=), share, and gather. Additionally, heap references are explicitly allocated using alloc and deallocated using free, as shown below.

```
fn new_heap_ref (#a:Type) (v:a)
requires emp
returns r:Box.box a
ensures Box.pts_to r v
{
    Box.alloc v
}
```

Note, we can return a freshly allocated heap reference from a function, unlike a let mut scoped, stack-allocated reference.

In the following example, we use open Box; to open the namespace Box in the following scope.

```
fn last_value_of #a (r:Box.box a)
requires Box.pts_to r 'v
returns v:a
ensures pure (v == 'v)
{
    open Box;
    let v = !r;
    free r;
    v
}
```

box t references can be demoted to regular ref t references for code reuse. For example, in the code below, we increment the contents of r:box int by first calling Box.to\_ref\_pts\_to to convert Box.pts\_to r 'v to a regular pts\_to (box\_to\_ref r) 'v; then calling incr (box\_to\_ref r); and then converting back to a Box.pts\_to.

Finally, unlike Rust's Box<T> type, which is always treated linearly (i.e., in Rust, one always holds exclusive read/write permission on a `Box<T>), in Pulse, Box.pts\_to r #p v has an implicit fractional permission as with regular references.

# 32.4 Ghost references

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**CHAPTER** 

## **THIRTYTHREE**

## **EXISTENTIAL QUANTIFICATION**

A very common specification style in Pulse involves the use of the existential quantifier. Before we can start to write interesting examples, let's take a brief look at how existential quantification works.

As mentioned in the *introduction to Pulse*, one of the connectives of Pulse's separation logic is the existential quantifier. Its syntax is similar to F\*'s existential quantifier, except it is written exists\* instead of just exists, and its body is a slprop, as in the examples shown below.

```
exists* (v:nat). pts_to x v

exists* v. pts_to x v

exists* v1 v2. pts_to x v1 ** pts_to y v2
...
```

# 33.1 Some simple examples

Looking back to the assign example from the previous chapter (shown below), you may have wondered why we bothered to bind a logical variable 'v in precondition of the specification, since it is never actually used in any other predicate.

```
fn assign (#a:Type) (r:ref a) (v:a)
requires pts_to r 'v
ensures pts_to r v
{
    r := v;
}
```

And indeed, another way to write the specification of assign, without the logical variable argument, is shown below.

```
fn assign #a (x:ref a) (v:a)
requires
  exists* w. pts_to x w
ensures
  pts_to x v
{
    x := v
}
```

This time, in the precondition, we use an existential quantifier to say that assign is callable in a context where x points to any value w.

Usually, however, the postcondition of a function *relates* the initial state prior to the call to the state after the call and existential variables are only in scope as far to the right as possible of the enclosing slprop. So, existential quantifiers in the precondition of a function are not so common.

To illustrate, the following attempted specification of incr does not work, since the existentially bound w0 is not in scope for the postcondition.

```
[@@expect_failure]
fn incr #a (x:ref int)
requires
  exists* w0. pts_to x w
ensures
  pts_to x (w0 + 1) //w0 is not in scope here
{
  let w = !x
  x := w + 1
}
```

However, existential quantification often appears in postconditions, e.g., in order to abstract the behavior of function by underspecifying it. To illustrate, consider the function  $make\_even$  below. It's type states that it sets the contents of x to some even number w1, without specifying w1 exactly. It also uses an existential quantification in its precondition, since its postcondition does not depend on the initial value of x.

```
fn make_even (x:ref int)
requires
   exists* w0. pts_to x w0
ensures
   exists* w1. pts_to x w1 ** pure (w1 % 2 == 0)
{
   let v = !x;
   x := v + v;
}
```

# 33.2 Manipulating existentials

In a previous chapter on *handling classical connectives*, we saw how F\* provides various constructs for introducing and eliminating logical connectives, including the existential quantifier. Pulse also provides constructs for working explicitly with existential quantifiers, though, usually, Pulse automation takes care of introducing and eliminating existentials behind the scenes. However, the explicit operations are sometimes useful, and we show a first example of how they work below

```
fn make_even_explicit (x:ref int)
requires
   exists* w0. pts_to x w0
ensures
   exists* w1. pts_to x w1 ** pure (w1 % 2 == 0)
{
   with w0. assert (pts_to x w0);
   let v = !x; // v:int; _:squash(v==w0); Ctxt=pts_to x v
   x := v + v; // ... pts_to x (v + v)
```

(continues on next page)

```
introduce
  exists* w1. pts_to x w1 ** pure (w1 % 2 == 0)
  with (v + v);
}
```

### 33.2.1 Eliminating existentials

The form with w0...wn. assert p; rest is often used as an eliminator for an existential. When the context contains exists\* x0...xn. p, the with construct binds w0... wn to the existentially bound variables in the remainder of the scope rest.

A show\_proof\_state immediately after the with w0. assert (pts\_to x w0) prints the following:

```
- Current context:
   pts_to x (reveal w0) **
   emp
- In typing environment:
   [w0#2 : erased int,
   x#1 : ref int]
```

That is, we have w0:erased int in scope, and pts\_to x (reveal w0) in context.

Here is another example usage of with, this time with multiple binders.

```
fn make_even_explicit_alt (x y:ref int)
requires
  exists* wx wy. pts_to x wx ** pts_to y wy ** pure (wx % 2 == wy % 2)
ensures
  exists* wx' wy'. pts_to x wx' ** pts_to y wy' ** pure (wx' % 2 == 0)
{
  with wx wy. _;
  let vx = !x;
  let vy = !y;
  x := vx + vy;
  introduce exists* wx' wy'. pts_to x wx' ** pts_to y wy' ** pure (wx' % 2 == 0)
  with (vx + vy) vy;
}
```

When there is a single existential formula in the context, one can write with x1..xn. \_to "open" the formula, binding its witnesses in scope. A show\_proof\_state after the first line prints:

```
- Current context:
   pts_to x (reveal wx) **
   pts_to y (reveal wy) **
   pure (eq2 (op_Modulus (reveal wx) 2) (op_Modulus (reveal wy) 2)) **
   emp
- In typing environment:
   [_#5 : squash (eq2 (op_Modulus (reveal wx) 2) (op_Modulus (reveal wy) 2)),
   wy#4 : erased int,
   wx#3 : erased int,
   y#2 : ref int,
   x#1 : ref int]
```

# 33.2.2 Introducing existentials

The Pulse checker will automatically introduce existential formulas by introduces new unification variables for each existentially bound variable, and then trying to find solutions for those variables by matching slprops in the goal with those in the context.

However, one can also introduce existential formulas explicitly, using the introduce exists\* syntax, as seen in the two examples above. In general, one can write

```
introduce exists* x1 .. xn. p
with w1...wn
```

explicitly providing witnesses w1..wn for each of the existentially bound variables x1..xn.

**CHAPTER** 

### **THIRTYFOUR**

### **USER-DEFINED PREDICATES**

In addition to the slprop predicates and connectives that the Pulse libraries provide, users very commonly define their own slprops. We show a few simple examples here—subsequent examples will make heavy use of user-defined predicates. For example, see this section for *recursively defined predicates*.

# 34.1 Fold and Unfold with Diagonal Pairs

A simple example of a user-defined abstraction is show below.

pts\_to\_diag r v is a slprop defined in F\* representing a reference to a pair whose components are equal.

We can use this abstraction in a Pulse program, though we have to be explicit about folding and unfolding the predicate.

```
fn double (r:ref (int & int))
requires pts_to_diag r 'v
ensures pts_to_diag r (2 * 'v)
{
  unfold (pts_to_diag r 'v);
  let v = !r;
  let v2 = fst v + snd v;
  r := (v2, v2);
  fold (pts_to_diag r v2);
}
```

The unfold p command checks that p is provable in the current context by some term q, and then rewrites the context by replacing that occurrence of q with the term that results from unfolding the head symbol of p. A show\_proof\_state after the unfold shows that we have a pts\_to r (reveal 'v, reveal 'v) in the context, exposing the abstraction of the pts\_to\_diag predicate.

At the end of function, we use the fold p command: this checks that the unfolding of p is provable in the context by some term q and then replaces q in the context with p.

fold and unfold is currently very manual in Pulse. While in the general case, including with recursively defined predicates, automating the placement of folds and unfolds is challenging, many common cases (such as the ones here) can be easily automated. We are currently investigating adding support for this.

Some initial support for this is already available, inasmuch as Pulse can sometimes figure out the arguments to the slprops that need to be folded/unfolded. For instance, in the code below, we just mention the name of the predicate to be unfolded/folded, without needing to provide all the arguments.

```
fn double_alt (r:ref (int & int))
requires pts_to_diag r 'v
ensures pts_to_diag r (2 * 'v)
{
   unfold pts_to_diag;
   let v = !r;
   let v2 = fst v + snd v;
   r := (v2, v2);
   fold pts_to_diag;
}
```

### 34.2 Mutable Points

As a second, perhaps more realistic example of a user-defined abstraction, we look at defining a simple mutable data structure: a structure with two mutable integer fields, representing a 2-dimensional point.

```
noeq
type point = {
    x:ref int;
    y:ref int;
}
let is_point (p:point) (xy: int & int) =
    pts_to p.x (fst xy) **
    pts_to p.y (snd xy)
```

A point is just an F\* record containing two references. Additionally, we define is\_point, a slprop, sometimes called a "representation predicate", for a point. is\_point p xy says that p is a representation of the logical point xy, where xy is pure, mathematical pair.

We can define a function move, which translates a point by some offset dx, dy.

```
fn move (p:point) (dx:int) (dy:int)
requires is_point p 'xy
ensures is_point p (fst 'xy + dx, snd 'xy + dy)
{
    unfold is_point;
    let x = !p.x;
    let y = !p.y;
    p.x := x + dx;
    p.y := y + dy;
    fold (is_point p (x + dx, y + dy));
}
```

Implementing move is straightforward, but like before, we have to unfold the is\_point predicate first, and then fold it back up before returning.

Unfortunately, Pulse cannot infer the instantiation of is\_point when folding it. A show\_proof\_state prior to the fold should help us see why:

- We have pts\_to p.x (x + dx) \*\* pts\_to p.y (y + dy)
- For fold (is\_point p.x ?w) to succeed, we rely on F\*'s type inference to find a solution for the unsolved witness ?w such that fst ?w == (x + dx) and snd ?w == (y + dy). This requires an eta-expansion rule for pairs to solve ?w := (x + dx, y + dy), but F\*'s type inference does not support such a rule for pairs.

So, sadly, we have to provide the full instantiation is point p (x + dx, y + dy) to complete the proof.

This pattern is a common problem when working with representation predicates that are indexed by complex values, e.g., pairs or records. It's common enough that it is usually more convenient to define a helper function to fold the predicate, as shown below.

```
ghost
fn fold_is_point (p:point)
requires pts_to p.x 'x ** pts_to p.y 'y
ensures is_point p (reveal 'x, reveal 'y)
{
   fold (is_point p (reveal 'x, reveal 'y))
}
```

**Note:** We've marked this helper function ghost. We'll look into ghost functions in much more detail in a later chapter.

This allows type inference to work better, as shown below.

```
fn move_alt (p:point) (dx:int) (dy:int)
requires is_point p 'xy
ensures is_point p (fst 'xy + dx, snd 'xy + dy)
{
    unfold is_point;
    let x = !p.x;
    let y = !p.y;
    p.x := x + dx;
    p.y := y + dy;
    fold_is_point p;
}
```

# 34.3 Rewriting

In addition to fold and unfold, one also often uses the rewrite command when working with defined predicates. Its general form is:

```
with x1 ... xn. rewrite p as q;
rest
```

Its behavior is to find a substitution subst that instantiates the  $x1 \dots xn$  as  $v1 \dots vn$ , such that subst(p) is supported by c in the context, Pulse aims to prove that subst(p) == subst(q) and replaces c in the context by subst(q) and proceeds to check subst(rest).

To illustrate this at work, consider the program below:

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```
fn create and move ()
requires emp
ensures emp
   let mut x = 0:
   let mut y = 0;
   let p = { x; y };
   //pts_to x 0 ** pts_to y 0
   with _v. rewrite pts_to x _v as pts_to p.x _v;
   with _v. rewrite pts_to y _v as pts_to p.y _v;
   //pts_to p.x 0 ** pts_to p.y 0
   fold_is_point p;
   move p 1 1;
   assert (is_point p (1, 1));
   unfold is_point;
   //pts_to p.x (fst (1, 1)) ** pts_to p.y (snd (1, 1))
   with _v. rewrite pts_to p.x _v as pts_to x _v;
   with _v. rewrite pts_to p.y _v as pts_to y _v;
   //pts_to x (fst (1, 1)) ** pts_to y (snd (1, 1))
}
```

We allocate two references and put them in the structure p. Now, to call fold\_is\_point, we need pts\_to p.x \_ and pts\_to p.y \_, but the context only contains pts\_to x \_ and pts\_to y \_. The rewrite command transforms the context as needed.

At the end of the function, we need to prove that  $pts\_to x \_ and pts\_to y \_ as we exit the scope of y and x, so that they can be reclaimed. Using rewrite in the other direction accomplishes this.$ 

This is quite verbose. As with fold and unfold, fully automated rewrite in the general case is hard, but many common cases are easy and we expect to add support for that to the Pulse checker.

In the meantime, Pulse provides a shorthand to make some common rewrites easier.

The rewrite each command has the most general form:

```
with x1 ... xn. rewrite each e1 as e1', ..., en as en' in goal
```

This is equivalent to:

```
with x1 ... xn. assert goal;
rewrite each e1 as e1', ..., en as en' in goal
```

```
rewrite each e1 as e1', ..., en as en' in goal
```

is equivalent to

```
rewrite goal as goal'
```

where goal' is computed by rewriting, in parallel, every occurrence of ei as ei' in goal.

Finally, one can also write:

```
rewrite each el as el', ..., en as en'
```

omitting the goal term. In this case, the goal is taken to be the entire current slprop context.

Using rewrite each ... makes the code somewhat shorter:

```
fn create_and_move_alt ()
requires emp
ensures emp
{
   let mut x = 0;
   let mut y = 0;
   let p = { x; y };
   rewrite each x as p.x, y as p.y;
   fold_is_point p;
   move p 1 1;
   assert (is_point p (1, 1));
   unfold is_point;
   rewrite each p.x as x, p.y as y;
}
```

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**CHAPTER** 

## **THIRTYFIVE**

## CONDITIONALS

To start writing interesting programs, we need a few control constructs. In this chapter, we'll write some programs with branches of two kinds: if/else and match.

# 35.1 A Simple Branching Program: Max

Here's a simple program that returns the maximum value stored in two references.

This program illustrates a very common specification style.

- We have a pure, F\* function max\_spec
- And a Pulse function working on mutable references, with a specification that relates it to the pure F\* spec. In this case, we prove that max behaves like max\_spec on the logical values that witness the contents of the two references.

The implementation of max uses a Pulse conditional statement. Its syntax is different from the F\* if-then-else expression: Pulse uses a more imperative syntax with curly braces, which should be familiar from languages like C.

### 35.1.1 Limitation: Non-tail Conditionals

Pulse's inference machinery does not yet support conditionals that appear in non-tail position. For example, this variant of max fails, with the error message shown below.

```
fn max_alt #p #q (x y:ref int)
requires pts_to x #p 'vx ** pts_to y #q 'vy
returns n:int
ensures pts_to x #p 'vx ** pts_to y #q 'vy
        ** pure (n == max_spec 'vx 'vy)
{
   let mut result = 0;
   let vx = !x;
   let vy = !y;
   if (vx > vy)
       result := vx;
   else
    {
       result := vy;
   }:
   !result;
}
```

Pulse cannot yet infer a postcondition for a non-tail conditional statement;
Either annotate this `if` with `returns` clause; or rewrite your code to use a tail.

conditional

Here's an annotated version of max\_alt that succeeds.

```
fn max_alt #p #q (x y:ref int)
requires pts_to x #p 'vx ** pts_to y #q 'vy
returns n:int
ensures pts_to x #p 'vx ** pts_to y #q 'vy
        ** pure (n == max_spec 'vx 'vy)
{
   let mut result = 0;
   let vx = !x;
   let vy = !y;
   if (vx > vy)
   ensures
     exists* r.
       pts_to x #p 'vx **
       pts_to y #q 'vy **
      pts_to result r **
       pure (r == max_spec 'vx 'vy)
    {
       result := vx;
   }
   else
    {
       result := vy;
```

(continues on next page)

```
};
!result;
}
```

We are working on adding inference for non-tail conditionals.

# 35.2 Pattern matching with nullable references

To illustrate the use of pattern matching, consider the following representation of a possibly null reference.

## 35.2.1 Representation predicate

We can represent a nullable ref as just an option (ref a) coupled with a representation predicate, pts\_to\_or\_null. A few points to note:

- The notation (#[default\_arg (\`1.0R)] p:perm) is F\* syntax for an implicit argument which when omitted defaults to 1.0R—this is exactly how predicates like Pulse.Lib.Reference.pts\_to are defined.
- The definition is by cases: if the reference x is None, then the logical witness is None too.
- Otherwise, the underlying reference points to some value w and the logical witness v == Some w agrees with that value.

Note, one might consider defining it this way:

```
let pts_to_or_null #a
        (x:nullable_ref a)
        (#[default_arg (`1.0R)] p:perm)
        (v:option a)
: slprop
= match x with
        | None -> pure (v == None)
        | Some x -> pure (Some? v) ** pts_to x #p (Some?.v v)
```

However, unlike  $F^*$ 's conjunction p / q where the well-typedness of q can rely on p, the \*\* operator is not left-biased; so (Some?.v v) cannot be proven in this context and the definition is rejected.

Another style might be as follows:

```
let pts_to_or_null #a
    (x:nullable_ref a)
    (continues on next page)
```

```
(#[default_arg (`1.0R)] p:perm)
   (v:option a)
: slprop
= match x, v with
   | None, None -> emp
   | Some x, Some w -> pts_to x #p w
   | _ -> pure False
```

This could also work, though it would require handling an additional (impossible) case.

## 35.2.2 Reading a nullable ref

Let's try our first pattern match in Pulse:

```
fn read_nullable #a #p (r:nullable_ref a)
requires pts_to_or_null r #p 'v
returns o:option a
ensures pts_to_or_null r #p 'v
        ** pure ('v == o)
{
    match r {
     Some x \rightarrow \{
        rewrite each r as (Some x);
        unfold (pts_to_or_null (Some x) #p 'v);
        let o = !x;
        fold (pts_to_or_null (Some x) #p 'v);
        rewrite each (Some x) as r;
        Some o
     None -> {
        rewrite each r as None;
        unfold (pts_to_or_null None #p 'v);
        fold (pts_to_or_null None #p 'v);
        rewrite each (None #(ref a)) as r;
        None
    }
    }
}
```

The syntax of pattern matching in Pulse is more imperative and Rust-like than what F\* uses.

- The entire body of match is enclosed within braces
- Each branch is also enclosed within braces.
- Pulse (for now) only supports simple patterns with a single top-level constructor applied to variables, or variable patterns: e.g., you cannot write Some (Some x) as a pattern.

The type of read\_nullable promises to return a value equal to the logical witness of its representation predicate.

The code is a little tedious—we'll see how to clean it up a bit shortly.

A show\_proof\_state in the Some x branch prints the following:

```
- Current context:
    pts_to_or_null r (reveal 'v)
- In typing environment:
    [branch equality#684 : squash (eq2 r (Some x)),
    ...
```

The interesting part is the branch equality hypothesis, meaning that in this branch, we can assume that (r == Some x). So, the first thing we do is to rewrite r; then we unfold the representation predicate; read the value o out of x; fold the predicate back; rewrite in the other direction; and return Some o. The None case is similar.

Another difference between Pulse and F\* matches is that Pulse does not provide any negated path conditions. For example, in the example below, the assertion fails, since the pattern is only a wildcard and the Pulse checker does not prove not (Some? x) as the path condition hypothesis for the preceding branches not taken.

```
[@@expect_failure]
fn read_nullable_alt #a #p (r:nullable_ref a)
requires pts_to_or_null r #p 'v
returns o:option a
ensures emp
{
    match r {
     Some x \rightarrow \{ admit () \}
     _ -> {
        // we only have r == _ in scope
        // not the negation of the prior branch conditions
        // i.e., unlike F^*, we don't have not (Some? r)
        // so the assertion below fails
        assert (pure (r == None));
        admit() }
    }
}
```

We plan to enhance the Pulse checker to also provide these negated path conditions.

## **35.2.3 Helpers**

When a slprop is defined by cases (like pts\_to\_or\_null) it is very common to have to reason according to those cases when pattern matching. Instead of rewriting, unfolding, folding, and rewriting every time, one can define helper functions to handle these cases.

```
ghost
fn elim_pts_to_or_null_none #a #p (r:nullable_ref a)
requires pts_to_or_null r #p 'v ** pure (r == None)
ensures pts_to_or_null r #p 'v ** pure ('v == None)
{
    rewrite each r as None;
    unfold (pts_to_or_null None #p 'v);
    fold (pts_to_or_null None #p 'v);
    rewrite each (None #(ref a)) as r;
}
ghost
fn intro_pts_to_or_null_none #a #p (r:nullable_ref a)
```

(continues on next page)

```
requires pure (r == None)
ensures pts_to_or_null r #p None
   fold (pts_to_or_null #a None #p None);
   rewrite each (None #(ref a)) as r;
}
ghost
fn elim_pts_to_or_null_some #a #p (r:nullable_ref a) (x:ref a)
requires pts_to_or_null r #p 'v ** pure (r == Some x)
ensures exists* w. pts_to x #p w ** pure ('v == Some w)
   rewrite each r as (Some x);
   unfold (pts_to_or_null (Some x) #p 'v);
}
ghost
fn intro_pts_to_or_null_some #a #p (r:nullable_ref a) (x:ref a)
requires pts_to x #p 'v ** pure (r == Some x)
ensures pts_to_or_null r #p (Some 'v)
    fold (pts_to_or_null (Some x) #p (Some 'v));
   rewrite each (Some x) as r;
}
```

These functions are all marked ghost, indicating that they are purely for proof purposes only.

Writing these helpers is often quite mechanical: One could imagine that the Pulse checker could automatically generate them from the definition of pts\_to\_or\_null. Using F\*'s metaprogramming support, a user could also auto-generate them in a custom way. For now, we write them by hand.

Using the helpers, case analyzing a nullable reference is somewhat easier:

```
fn read_nullable_alt #a #p (r:nullable_ref a)
requires pts_to_or_null r #p 'v
returns o:option a
ensures pts_to_or_null r #p 'v
        ** pure ('v == o)
{
    match r {
     Some x \rightarrow \{
        elim_pts_to_or_null_some (Some x) x;
        let o = !x;
        intro_pts_to_or_null_some r x;
        Some o
     }
     None -> {
        unfold pts_to_or_null None 'v;
        fold pts_to_or_null None 'v;
        None
     }
    }
}
```

# 35.2.4 Writing a nullable reference

Having defined our helpers, we can use them repeatedly. For example, here is a function to write a nullable reference.

**CHAPTER** 

# **THIRTYSIX**

## **LOOPS & RECURSION**

In this chapter, we'll see how various looping constructs work in Pulse, starting with while and also recursive functions.

By default, Pulse's logic is designed for partial correctness. This means that programs are allowed to loop forever. When we say that program returns v:t satisfying a postcondition p, this should be understood to mean that the program could loop forever, but if it does return, it is guaranteed to return a v:t where the state satisfies p v.

# 36.1 While loops: General form

The form of a while loop is:

```
while ( guard )
invariant (b:bool). p
{ body }
```

#### Where

- guard is a Pulse program that returns a b:bool
- body is a Pulse program that returns unit
- invariant (b:bool). p is an invariant where
  - exists\* b. p must be provable before the loop is entered and as a postcondition of body.
  - exists\* b. p is the precondition of the guard, and p b is its postcondition, i.e., the guard must satisfy:

```
requires exists* b. p
returns b:bool
ensures p
```

- the postcondition of the entire loop is invariant false.

One way to understand the invariant is that it describes program assertions at three different program points.

- When b==true, the invariant describes the program state at the start of the loop body;
- when b==false, the invariant describes the state at the end of the loop;
- when b is undetermined, the invariant describes the property of the program state just before the guard is (re)executed, i.e., at the entry to the loop and at the end of loop body.

Coming up with an invariant to describe a loop often requires some careful thinking. We'll see many examples in the remaining chapters, starting with some simple loops here.

#### 36.1.1 Countdown

Here's our first Pulse program with a loop: count\_down repeatedly decrements a reference until it reaches 0.

```
fn count_down (x:ref nat)
requires R.pts_to x 'v
ensures R.pts_to x 0
    let mut keep_going = true;
    while (
        !keep_going
    invariant b.
      exists* (v:nat).
        pts_to keep_going b **
        pts_to x v **
        pure (b == false ==> v == 0)
    {
        let n = !x;
        if (n = 0)
        {
            keep_going := false;
        }
        else
        {
            x := n - 1;
    }
}
```

While loops in Pulse are perhaps a bit more general than in other languages. The guard is an arbitrary Pulse program, not just a program that reads some local variables. For example, here's another version of count\_down where the guard does all the work and the loop body is empty, and we don't need an auxiliary keep\_going variable.

```
fn count_down3 (x:ref nat)
requires R.pts_to x 'v
ensures R.pts_to x 0
    while (
        let n = !x;
        if (n = 0)
        {
             false
        }
        else
        {
             x := n - 1;
             true
        }
    )
    invariant b.
      exists* (v:nat).
        pts_to x v **
        pure (b == false ==> v == 0)
                                                                                (continues on next page)
```

```
{ O }
}
```

#### 36.1.2 Partial correctness

The partial correctness interpretation means that the following infinitely looping variant of our program is also accepted:

```
fn count_down_loopy (x:ref nat)
requires R.pts_to x 'v
ensures R.pts_to x 0
{
    while (
        let n = !x;
        if (n = 0)
        {
            false
        }
        else
        {
            x := n + 1;
            true
        }
    )
    invariant b.
      exists* v.
        R.pts_to x v **
        pure (b == false ==> v == 0)
    { () }
}
```

This program increments instead of decrement x, but it still satisfies the same invariant as before, since it always loops forever.

We do have a fragment of the Pulse logic, notably the logic of ghost and atomic computations that is guaranteed to always terminate. We plan to also support a version of the Pulse logic for general purpose sequential programs (i.e., no concurrency) that is also terminating.

# 36.1.3 Multiply by repeated addition

Our next program with a loop multiplies two natural numbers x, y by repeatedly adding y to an accumulator x times. This program has a bit of history: A 1949 paper by Alan Turing titled "Checking a Large Routine" is often cited as the first paper about proving the correctness of a computer program. The program that Turing describes is one that implements multiplication by repeated addition.

```
fn multiply_by_repeated_addition (x y:nat)
    requires emp
    returns z:nat
    ensures pure (z == x * y)
{
    let mut ctr : nat = 0;
    let mut acc : nat = 0;
```

(continues on next page)

```
while (
        let c = !ctr;
        (c < x)
    )
    invariant b.
    exists* (c a : nat).
        R.pts_to ctr c **
        R.pts_to acc a **
        pure (c <= x /\
              a == (c * y) / 
              b == (c < x)
    {
        let a = !acc;
        acc := a + y;
        let c = !ctr;
        ctr := c + 1;
    };
    !acc
}
```

A few noteworthy points:

- Both the counter ctr and the accumulator acc are declared nat, which implicitly, by refinement typing, provides an invariant that they are both always at least 0. This illustrates how Pulse provides a separation logic on top of F\*'s existing dependent type system.
- The invariant says that the counter never exceeds x; the accumulator is always the product of counter and y; and the loop continues so long as the counter is strictly less than x.

## 36.1.4 Summing the first N numbers

This next example shows a Pulse program that sums the first n natural numbers. It illustrates how Pulse programs can developed along with pure F\* specifications and lemmas.

We start with a specification of sum, a simple recursive function in F\* along with a lemma that proves the well-known identity about this sum.

```
let rec sum (n:nat)
: nat
= if n = 0 then 0 else n + sum (n - 1)

#push-options "--z3rlimit 20"
noextract
let rec sum_lemma (n:nat)
: Lemma (sum n == n * (n + 1) / 2)
= if n = 0 then ()
    else sum_lemma (n - 1)
#pop-options
```

Now, let's say we want to implement isum, an iterative version of sum, and prove that it satisfies the identity proven by sum\_lemma.

```
#push-options "--z3cliopt 'smt.arith.nl=false'"
noextract
fn isum (n:nat)
requires emp
returns z:nat
ensures pure ((n * (n + 1) / 2) == z)
    let mut acc : nat = 0;
    let mut ctr : nat = 0;
    while (
        let c = !ctr;
        (c < n)
    )
    invariant b.
    exists* (c a : nat).
        R.pts_to ctr c **
        R.pts_to acc a **
        pure (c <= n /\
              a == sum c / 
              b == (c < n))
    {
        let a = !acc;
        let c = !ctr;
        ctr := c + 1;
        acc := a + c + 1;
    sum_lemma n; //call an F* lemma inside Pulse
    !acc:
}
#pop-options
```

This program is quite similar to multiply\_by\_repeated\_addition, but with a couple of differences:

- The invariant says that the current value of the accumulator holds the sum of the first c numbers, i.e., we prove that the loop refines the recursive implementation of sum, without relying on any properties of non-linear arithmetic—notice, we have disabled non-linear arithmetic in Z3 with a pragma.
- Finally, to prove the identity we're after, we just call the  $F^*$  sum\_lemma that has already been proven from within Pulse, and the proof is concluded.

The program is a bit artificial, but hopefully it illustrates how Pulse programs can be shown to first refine a pure F\* function, and then to rely on mathematical reasoning on those pure functions to conclude properties about the Pulse program itself.

# 36.2 Recursion

Pulse also supports general recursion, i.e., recursive functions that may not terminate. Here is a simple example—we'll see more examples later.

Let's start with a standard F\* (doubly) recursive definition that computes the nth Fibonacci number.

```
let rec fib (n:nat) : nat =
  if n <= 1 then 1
  else fib (n - 1) + fib (n - 2)</pre>
```

One can also implement it in Pulse, as fib\_rec while using an out-parameter to hold that values of the last two Fibonacci numbers in the sequence.

```
fn rec fib_rec (n:pos) (out:ref (nat & nat))
requires
   pts_to out 'v
ensures
   exists* v.
       pts_to out v **
        pure (
          fst v == fib (n - 1) / 
          snd v == fib n
 if (n = 1)
   //type inference in Pulse doesn't work well here:
   //it picks (1, 1) to have type (int & int)
   //so we have to annotate
   out := ((1 <: nat), (1 <: nat));
  }
  else
    fib_rec (n - 1) out;
   let v = !out;
   out := (snd v, fst v + snd v);
  }
}
```

Some points to note here:

- Recursive definitions in Pulse are introduced with fn rec.
- So that we can easily memoize the last two values of fib, we expect the argument n to be a positive number, rather than also allowing 0.
- A quirk shown in the comments: We need an additional type annotation to properly type (1, 1) as a pair of nats.

Of course, one can also define fibonacci iteratively, with a while loop, as shown below.

```
let mut i : nat = 1;
  let mut j : nat = 1;
 let mut ctr : nat = 1;
  while (
   let c = !ctr;
    (c < k)
  )
  invariant b .
    exists* (vi vj vctr : nat).
        R.pts_to i vi **
        R.pts_to j vj **
        R.pts_to ctr vctr **
        pure (
            1 <= vctr /\
           vctr <= k /\
           vi == fib (vctr - 1) / 
            vj == fib vctr /\
           b == (vctr < k)
        )
  {
     let vi = !i;
     let vj = !j;
     let c = !ctr;
      ctr := c + 1;
     i := vj;
     j := vi + vj;
 };
  !j
}
```

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**CHAPTER** 

## **THIRTYSEVEN**

### **MUTABLE ARRAYS**

In this chapter, we will learn about mutable arrays in Pulse. An array is a contiguous collection of values of the same type. Similar to ref, arrays in Pulse can be allocated in the stack frame of the current function or in the heap—while the stack allocated arrays are reclaimed automatically (e.g., when the function returns), heap allocated arrays are explicitly managed by the programmer.

Pulse provides two array types: Pulse.Lib.Array.array t as the basic array type and Pulse.Lib.Vec.vec t for heap allocated arrays. To provide code reuse, functions that may operate over both stack and heap allocated arrays can be written using Pulse.Lib.Array.array t—the Pulse.Lib.Vec library provides back-and-forth coercions between vec t and array t.

# **37.1** array t

We illustrate the basics of array t with the help of the following example that reads an array:

```
fn read_i
  (#[@@@ Rust_generics_bounds ["Copy"]] t:Type)
  (arr:array t)
  (#p:perm)
  (#s:erased (Seq.seq t))
  (i:SZ.t { SZ.v i < Seq.length s })
  requires pts_to arr #p s
  returns x:t
  ensures pts_to arr #p s ** pure (x == Seq.index s (SZ.v i))
{
  arr.(i)
}</pre>
```

The library provides a points-to predicate pts\_to arr #p s with the interpretation that in the current memory, the contents of arr are same as the (functional) sequence s:FStar.Seq.seq t. Like the pts\_to predicate on reference, it is also indexed by an implicit fractional permission p, which distinguished shared, read-only access from exclusive read/write access.

In the arguments of read\_i, the argument `s is erased, since it is for specification only.

Arrays can be read and written-to using indexes of type FStar.SizeT.t, a model of C size\_t<sup>1</sup> in F\*, provided that the index is within the array bounds—the refinement SZ.v i < Seq.length s enforces that the index is in bounds, where module SZ = FStar.SizeT. The function returns the i-th element of the array, the asserted by the postcondition slprop pure (x == Seq.index s (SZ.v i)). The body of the function uses the array read operator arr.(i).

<sup>&</sup>lt;sup>1</sup> size\_t in C is an unsigned integer type that is at least 16 bits wide. The upper bound of size\_t is platform dependent. FStar.SizeT.size\_t models this type and is extracted to the primitive size\_t type in C, similar to the other *bounded integer types* discussed previously.

As another example, let's write to the i-th element of an array:

The function uses the array write operator arr(i) < -x and the postcondition asserts that in the state when the function returns, the contents of the array are same as the sequence s updated at the index i.

While any permission suffices for reading, writing requires 1.0R. For example, implementing write\_i without 1.0R is rejected, as shown below.

The library contains share and gather functions, similar to those for references, to divide and combine permissions on arrays.

We now look at a couple of examples that use arrays with conditionals, loops, existentials, and invariants, using many of the Pulse constructs we have seen so far.

#### **37.1.1 Compare**

Let's implement a function that compares two arrays for equality:

```
fn compare
    (#[@@@ Rust_generics_bounds ["PartialEq"; "Copy"]] t:eqtype)
    #p1 #p2
    (a1 a2:A.array t)
    (1:SZ.t)
    requires (
        A.pts_to a1 #p1 's1 **
        A.pts_to a2 #p2 's2 **
        pure (Seq.length 's1 == Seq.length 's2 /\ Seq.length 's2 == SZ.v l)
)
    returns res:bool
    ensures (
        A.pts_to a1 #p1 's1 **
        A.pts_to a2 #p2 's2 **
        pure (res <==> Seq.equal 's1 's2)
)
```

The function takes two arrays a1 and a2 as input, and returns a boolean. The postcondition pure (res <==> Seq. equal 's1 's2) specifies that the boolean is true if and only if the sequence representations of the two arrays are

equal. Since the function only reads the arrays, it is parametric in the permissions p1 and p2 on the two arrays. Note that the type parameter t has type eqtype, requiring that values of type t support decidable equality.

One way to implement compare is to use a while loop, reading the two arrays using a mutable counter and checking that the corresponding elements are equal.

```
let mut i = 0sz;
  while (
   let vi = !i;
    if (vi <^ 1) {
      let v1 = a1.(vi);
      let v2 = a2.(vi);
      (v1 = v2)
    } else {
      false
    }
  )
  invariant b.
  exists* vi. (
    R.pts_to i vi **
    A.pts_to a1 #p1 's1 **
    A.pts_to a2 #p2 's2 **
    pure (
      SZ.v vi \ll SZ.v 1 / 
      (b == (SZ.v vi < SZ.v l && Seq.index 's1 (SZ.v vi) = Seq.index 's2 (SZ.v vi))) /\
      (forall (i:nat). i < SZ.v vi ==> Seq.index 's1 i == Seq.index 's2 i)
    )
 )
    let vi = !i;
    i := vi +^ 1sz
  };
  let vi = !i;
  let res = vi = 1;
  res
}
```

The loop invariant states that (a) the arrays are pointwise equal up to the current value of the counter, and (b) the boolean b is true if and only if the current value of the counter is less than the length of the arrays and the arrays are equal at that index. While (a) helps proving the final postcondition of compare, (b) is required to maintain the invariant after the counter is incremented in the loop body.

#### 37.1.2 Copy

As our next example, let's implement a copy function that copies the contents of the array a2 to a1.

```
fn copy
  (#[@@@ Rust_generics_bounds ["Copy"]] t:Type0)
  (a1 a2:A.array t)
  (1:SZ.t)
  (#p2:perm)
  requires (
```

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```
A.pts_to a1 's1 **
   A.pts_to a2 #p2 's2 **
   pure (Seq.length 's1 == Seq.length 's2 /\ Seq.length 's2 == SZ.v 1)
 )
  ensures (
    (exists* s1. A.pts_to a1 s1 ** pure (Seq.equal s1 's2)) **
   A.pts_to a2 #p2 's2
  )
{
  let mut i = 0sz;
  while (
   let vi = !i;
    (vi <^ 1)
  invariant b.
  exists* vi s1. (
   R.pts_to i vi **
   A.pts_to a1 s1 **
   A.pts_to a2 #p2 's2 **
   pure (
      Seq.length s1 == Seq.length 's2 /
      SZ.v vi \ll SZ.v 1 /
      (b == (SZ.v vi < SZ.v 1)) / 
      (forall (i:nat). i < SZ.v vi ==> Seq.index s1 i == Seq.index 's2 i)
   )
 )
   let vi = !i;
   let v = a2.(vi);
   a1.(vi) <- v;
   i := vi +^ 1sz
 }
}
```

The loop invariant existentially abstracts over the contents of a1, and maintains that up to the current loop counter, the contents of the two arrays are equal. Rest of the code is straightforward, the loop conditional checks that the loop counter is less than the array lengths and the loop body copies one element at a time.

The reader will notice that the postcondition of copy is a little convoluted. A better signature would be the following, where we directly state that the contents of a1 are same as 's2:

```
fn copy2
  (#[@@@ Rust_generics_bounds ["Copy"]] t:Type0)
  (a1 a2:A.array t)
  (1:SZ.t)
  (#p2:perm)
  requires (
    A.pts_to a1 's1 **
    A.pts_to a2 #p2 's2 **
    pure (Seq.length 's1 == Seq.length 's2 /\ Seq.length 's2 == SZ.v 1)
  )
  ensures (
    A.pts_to a1 's2 **
```

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```
A.pts_to a2 #p2 's2
)
```

We can implement this signature, but it requires one step of rewriting at the end after the while loop to get the post-condition in this exact shape:

```
// after the loop
with v1 s1. _; //bind existentially bound witnesses from the invariant
Seq.lemma_eq_elim s1 's2; //call an F* lemma to prove that s1 == 's2
()
```

We could also rewrite the predicates explicitly, as we saw in a previous chapter.

# 37.2 Stack allocated arrays

Stack arrays can be allocated using the expression [ | v; n | ]. It allocates an array of size n, with all the array elements initialized to v. The size n must be compile-time constant. It provides the postcondition that the newly create array points to a length n sequence of v. The following example allocates two arrays on the stack and compares them using the compare function above.

```
fn compare_stack_arrays ()
  requires emp
  ensures emp
{
    // |- emp
  let mut a1 = [| 0; 2sz |];
    // a1:array int |- pts_to a1 (Seq.create 0 (SZ.v 2))
  let mut a2 = [| 0; 2sz |];
    // a1 a2:array int |- pts_to a1 (Seq.create 0 (SZ.v 2)) ** pts_to a2 (Seq.create 0 (SZ.v 2))
  let b = compare a1 a2 2sz;
  assert (pure b)
}
```

As with the stack references, stack arrays don't need to be deallocated or dropped, they are reclaimed automatically when the function returns. As a result, returning them from the function is not allowed:

```
[@@ expect_failure]

fn ret_stack_array ()
  requires emp
  returns a:array int
  ensures pts_to a (Seq.create 2 0)
{
  let mut a1 = [| 0; 2sz |];
   a1 // cannot prove pts_to a (Seq.create 0 2) in the context emp
}
```

# 37.3 Heap allocated arrays

The library Pulse.Lib.Vec provides the type vec t, for heap-allocated arrays: vec is to array as box is to ref.

Similar to array, vec is accompanied with a pts\_to assertion with support for fractional permissions, share and gather for dividing and combining permissions, and read and write functions. However, unlike array, the Vec library provides allocation and free functions.

```
module V = Pulse.Lib.Vec

fn heap_arrays ()
  requires emp
  returns a:V.vec int
  ensures V.pts_to a (Seq.create 2 0)
{
  let a1 = V.alloc 0 2sz;
  let a2 = V.alloc 0 2sz;
  V.free a1;
  a2 // returning vec is ok
}
```

As with the heap references, heap allocated arrays can be coerced to array using the coercion vec\_to\_array. To use the coercion, it is often required to convert Vec.pts\_to to Array.pts\_to back-and-forth; the library provides to\_array\_pts\_to and to\_vec\_pts\_to lemmas for this purpose.

The following example illustrates the pattern. It copies the contents of a stack array into a heap array, using the copy2 function we wrote above.

```
fn copy_app ([@@@ Rust_mut_binder] v:V.vec int)
    requires exists* s. V.pts_to v s ** pure (Seq.length s == 2)
    ensures V.pts_to v (Seq.create 2 0)
{
    let mut a = [| 0; 2sz |];
    // v, s |- V.pts_to v s ** ...
    V.to_array_pts_to v;
    // v, s |- pts_to (vec_to_array v) s ** ...
    copy2 (V.vec_to_array v) a 2sz;
    // v, s |- pts_to (vec_to_array v) (Seq.create 2 0) ** ...
    V.to_vec_pts_to v
    // v, s |- V.pts_to v (Seq.create 2 0) ** ...
}
```

Note how the assertion for v transforms from V.pts\_to to pts\_to (the points-to assertion for arrays) and back. It means that array algorithms and routines can be implemented with the array t type, and then can be reused for both stack- and heap-allocated arrays.

Finally, though the name vec a evokes the Rust std:: Vec library, we don't yet support automatic resizing.

**CHAPTER** 

## **THIRTYEIGHT**

## **GHOST COMPUTATIONS**

Throughout the chapters on pure F\*, we made routine use of the Lemmas and ghost functions to prove properties of our programs. Lemmas, you will recall, are pure, total functions that always return unit, i.e., they have no computational significance and are erased by the F\* compiler. F\* *ghost functions* are also pure, total functions, except that they are allowed to inspect erased values in a controlled way—they too are erased by the F\* compiler.

As we've seen already, F\* lemmas and ghost functions can be directly used in Pulse code. But, these are only useful for describing properties about the pure values in scope. Often, in Pulse, one needs to write lemmas that speak about the state, manipulate slprops, etc. For this purpose, Pulse provides its own notion of *ghost computations* (think of these as the analog of F\* lemmas and ghost functions, except they are specified using slprops); and *ghost state* (think of these as the analog of F\* erased types, except ghost state is mutable, though still computationally irrelevant). Ghost computations are used everywhere in Pulse—we've already seen a few example. Ghost state is especially useful in proofs of concurrent programs.

## 38.1 Ghost Functions

Here's a Pulse function that fails to check, with the error message below.

```
[@@expect_failure]
fn incr_erased_non_ghost (x:erased int)
requires emp
returns y:int
ensures emp ** pure (y == x + 1)
{
   let x = reveal x;
   (x + 1)
}
```

```
Cannot bind ghost expression reveal x with ST computation
```

We should expect this to fail, since the program claims to be able to compute an integer y by incrementing an erased integer x—the x:erased int doesn't exist at runtime, so this program cannot be compiled.

But, if we tag the function with the ghost qualifier, then this works:

```
ghost
fn incr_erased (x:erased int)
requires emp
returns y:int
ensures emp ** pure (y == x + 1)
{
```

(continues on next page)

```
let x = reveal x;
  (x + 1)
}
```

The ghost qualifier indicates the Pulse checker that the function is to be erased at runtime, so ghost functions are allowed to make use of F\* functions with GTot effect, like FStar.Ghost.reveal.

However, for this to be sound, no compilable code is allowed to depend on the return value of a ghost function. So, the following code fails with the error below:

```
[@@expect_failure]
fn use_incr_erased (x:erased int)
requires emp
returns y:int
ensures emp ** pure (y == x + 1)
{
  incr_erased x;
}
```

```
Expected a term with a non-informative (e.g., erased) type; got int
```

That is, when calling a ghost function from a non-ghost context, the return type of the ghost function must be non-informative, e.g, erased, or unit etc. The class of non-informative types and the rules for allowing F\* ghost computations to be used in total contexts is described here, and the same rules apply in Pulse.

To use of incr\_erased in non-ghost contexts, we have to erase its result. There are a few ways of doing this.

Here's a verbose but explicit way, where we define a nested ghost function to wrap the call to incr\_erased.

```
fn use_incr_erased (x:erased int)
requires emp
returns y:erased int
ensures emp ** pure (y == x + 1)
{
    ghost
    fn wrap (x:erased int)
    requires emp
    returns y:erased int
    ensures emp ** pure (y == x + 1)
    {
        let y = incr_erased x;
        hide y
    };
    wrap x
}
```

The library also contains Pulse.Lib.Pervasives.call\_ghost that is a higher-order combinator to erase the result of a ghost call.

```
fn use_incr_erased_alt (x:erased int)
requires emp
returns y:erased int
ensures emp ** pure (y == x + 1)
{
    (continues on next page)
```

```
call_ghost incr_erased x;
}
```

The call\_ghost combinator can be used with ghost functions of different arities, though it requires the applications to be curried in the following way.

Suppose we have a binary ghost function, like add\_erased:

```
ghost
fn add_erased (x y:erased int)
requires emp
returns z:int
ensures emp ** pure (z == x + y)
{
  let x = reveal x;
  let y = reveal y;
    (x + y)
}
```

To call it in a non-ghost context, one can do the following:

```
fn use_add_erased (x y:erased int)
requires emp
returns z:erased int
ensures emp ** pure (z == x + y)
{
    call_ghost (add_erased x) y
}
```

That said, since ghost functions must have non-informative return types to be usable in non-ghost contexts, it's usually best to define them that way to start with, rather than having to wrap them at each call site, as shown below:

```
ghost
fn add_erased_erased (x y:erased int)
requires emp
returns z:erased int
ensures emp ** pure (z == x + y)
{
    let x = reveal x;
    let y = reveal y;
    hide (x + y)
}
```

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# 38.2 Some Primitive Ghost Functions

Pulse ghost functions with emp or pure  $\_$  pre and postconditions are not that interesting—such functions can usually be written with regular  $F^*$  ghost functions.

Ghost functions are often used as proof steps to prove equivalences among slprops. We saw a few *examples of ghost functions before*—they are ghost since their implementations are compositions of ghost functions from the Pulse library.

The rewrite primitive that we saw *previously* is in fact a defined function in the Pulse library. Its signature looks like this:

```
ghost
fn __rewrite (p q:slprop)
requires p ** pure (p == q)
ensures q
```

Many of the other primitives like fold, unfold, etc. are defined in terms of rewrite and are ghost computations.

Other primitives like introduce exists\* are also implemented in terms of library ghost functions, with signatures like the one below:

```
ghost
fn intro_exists (#a:Type0) (p:a -> slprop) (x:erased a)
requires p x
ensures exists* x. p x
```

# 38.3 Recursive Predicates and Ghost Lemmas

We previously saw how to *define custom predicates*, e.g., for representation predicates on data structures. Since a slprop is just a regular type, one can also define slprops by recursion in F\*. Working with these recursive predicates in Pulse usually involves writing recursive ghost functions as lemmas. We'll look at a simple example of this here and revisit in subsequent chapters as look at programming unbounded structures, like linked lists.

Say you have a list of references and want to describe that they all contain integers whose value is at most n. The recursive predicate all\_at\_most 1 n does just that:

```
let rec all_at_most (l:list (ref nat)) (n:nat)
: slprop
= match l with
    | [] -> emp
    | hd::tl -> exists* (i:nat). pts_to hd i ** pure (i <= n) ** all_at_most tl n</pre>
```

As we did when working with *nullable references*, it's useful to define a few helper ghost functions to introduce and eliminate this predicate, for each of its cases.

#### 38.3.1 Recursive Ghost Lemmas

Pulse allows writing recursive ghost functions as lemmas for use in Pulse code. Like F\* lemmas, recursive ghost functions must be proven to terminate on all inputs—otherwise, they would not be sound.

To see this in action, let's write a ghost function to prove that all\_at\_most 1 n can be weakened to all\_at\_most 1 m when  $n \le m$ .

```
ghost
fn rec weaken_at_most (1:list (ref nat)) (n:nat) (m:nat)
requires all_at_most l n ** pure (n <= m)</pre>
ensures all_at_most 1 m
decreases 1
  match 1 {
    [] -> {
      unfold (all_at_most [] n);
      fold (all_at_most [] n);
    hd :: tl -> {
      unfold (all_at_most (hd::tl) n);
      weaken_at_most tl n m;
      fold (all_at_most (hd::tl) m);
    }
  }
}
```

A few points to note:

- Recursive functions in Pulse are defined using fn rec.
- Ghost recursive functions must also have a decreases annotation—unlike in F\*, Pulse does not yet attempt to infer a default decreases annotation. In this case, we are recursing on the list 1.
- List patterns in Pulse do not (yet) have the same syntactic sugar as in F\*, i.e., you cannot write [] and hd::tl as patterns.
- The proof itself is fairly straightforward:
  - In the Nil case, we eliminate the all\_at\_most predicate at n and introduce it at m.
  - In the Cons case, we eliminate all\_at\_most 1 n,` use the induction hypothesis to weaken the all\_at\_most predicate on the tl; and then introduce it again, packaging it with assumption on hd.

## 38.4 Mutable Ghost References

The underlying logic that Pulse is based on actually supports a very general form of ghost state based on partial commutative monoids (PCMs). Users can define their own ghost state abstractions in F\* using PCMs and use these in Pulse programs. The library Pulse.Lib.GhostReference provides the simplest and most common form of ghost state: references to erased values with a fractional-permission-based ownership discipline.

We'll use the module abbreviation module GR = Pulse.Lib.GhostReference in what follows. The library is very similar to Pulse.Lib.Reference, in that it provides:

GR.ref a: The main type of ghost references. GR.ref is an erasable type and is hence considered non-informative.

- GR.pts\_to (#a:Type0) (r:GR.ref a) (#p:perm) (v:a) : slprop is the main predicate provided by the library. Similar to the regular pts\_to, the permission index defaults to 1.0R.
- Unlike ref a (and more like box a), ghost references GR.ref a are not lexically scoped: they are allocated using GR.alloc and freed using GR.free. Of course, neither allocation nor free'ing has any runtime cost—these are just ghost operations.
- Reading a ghost reference using !rreturns an erased a, when r:GR.ref a. Likewise, to update r, it is enough to provide a new value v:erased a.
- Operations to share and gather ghost references work just as with ref.

## 38.4.1 A somewhat contrived example

Most examples that require ghost state usually involve stating interesting invariants between multiple threads, or sometimes in a sequential setting to correlate knowledge among different components. We'll see examples of that in a later chapter. For now, here's a small example that gives a flavor of how ghost state can be used.

Suppose we want to give a function read/write access to a reference, but want to ensure that before it returns, it resets the value of the reference to its original value. The simplest way to do that would be to give the function the following signature:

```
fn uses_but_resets #a (x:ref a)
requires pts_to x 'v
ensures pts_to x 'v
```

Here's another way to do it, this time with ghost references.

First, we define a predicate correlated that holds full permission to a reference and half permission to a ghost reference, forcing them to hold the same value.

```
let correlated #a (x:ref a) (y:GR.ref a) (v:a)=
  pts_to x v ** GR.pts_to y #0.5R v
```

Now, here's the signature of a function use\_temp: at first glance, from its signature alone, one might think that the witness v0 bound in the precondition is unrelated to the v1 bound in the postcondition.

```
fn use_temp (x:ref int) (y:GR.ref int)
requires exists* v0. correlated x y v0
ensures exists* v1. correlated x y v1
```

But, use\_temp only has half-permission to the ghost reference and cannot mutate it. So, although it can mutate the reference itself, in order to return its postcondition, it must reset the reference to its initial value.

```
{
  unfold correlated;
  let v = !x;
  x := 17; //temporarily mutate x, give to to another function to use with full perm
  x := v; //but, we're forced to set it back to its original value
  fold correlated;
}
```

This property can be exploited by a caller to pass a reference to use\_temp and be assured that the value is unchanged when it returns.

**CHAPTER** 

## **THIRTYNINE**

### HIGHER ORDER FUNCTIONS

Like F\*, Pulse is higher order. That is, Pulse functions are first class and can be passed to other functions, returned as results, and some functions can even be stored in the heap.

# 39.1 Pulse Computation Types

Here's perhaps the simplest higher-order function: apply abstracts function application.

This function is polymorphic in the argument, result type, pre, and post-condition of a function f, which it applies to an argument x. This is the first time we have written the type of a Pulse function as an  $F^*$  type. So far, we have been writing *signatures* of Pulse functions, using the fn/requires/ensures notation, but here we see that the type of Pulse function is of the form:

```
x:a -> stt b pre (fun y -> post)
```

where,

- like any F\* function type, Pulse functions are dependent and the right hand side of the arrow can mention x
- $\bullet$  immediately to the right of the arrow is a Pulse computation type tag, similar to F\*'s Tot, or GTot, etc.
- The tag stt is the most permissive of Pulse computation type tags, allowing the function's body to read and write the state, run forever etc., but with pre-condition pre, return type b, and post-condition fun y -> post.

Pulse provides several other kinds of computation types. For now, the most important is the constructor for ghost computations. We show below apply\_ghost, the analog of apply but for ghost functions.

```
ghost
fn apply_ghost
(continues on next page)
```

```
(#a:Type0)
    (#b:a -> Type0)
    (#pre:a -> slprop)
    (#post: (x:a -> b x -> slprop))
    (f: (x:a -> stt_ghost (b x) emp_inames (pre x) (fun y -> post x y)))
    (x:a)
requires pre x
returns y:b x
ensures post x y
{
    f x
}
```

The type of f is similar to what we had before, but this time we have:

- computation type tag stt\_ghost, indication that this function reads or writes ghost state only, and always terminates.
- the return type is b x
- the next argument is emp\_inames, describes the set of invariants that a computation may open, where emp\_inames means that this computation opens no invariants. For now, let's ignore this.
- the precondition is pre x and the postcondition is fun  $y \rightarrow post x y$ .

#### 39.1.1 Universes

For completeness, the signature of stt and stt\_ghost are shown below:

```
val stt (a:Type u#a) (i:inames) (pre:slprop) (post: a -> slprop)
  : Type u#0

val stt_ghost (a:Type u#a) (i:inames) (pre:slprop) (post: a -> slprop)
  : Type u#4
```

A point to note is that stt computations live in universe u#0. This is because stt computations are allowed to infinitely loop, and are built upon *the effect of divergence*, or Div, which, as we learned earlier, lives in universe u#0. The universe of stt means that one can store an stt function in an reference, e.g., ref (unit -> stt unit p q) is a legal type in Pulse.

In contrast, stt\_ghost functions are total and live in universe 4. You cannot store a stt\_ghost function in the state, since that would allow writing non-terminating functions in stt\_ghost.

#### 39.2 Counters

For a slightly more interesting use of higher order programming, let's look at how to program a mutable counter. We'll start by defining the type ctr of a counter.

```
destroy: i:erased int -> stt unit (inv i) (fun _ -> emp)
}
```

A counter packages the following:

- A predicate inv on the state, where inv i states that the current value of the counter is i, without describing exactly how the counter's state is implemented.
- A stateful function next that expects the inv i, returns the current value i of the counter, and provides inv (i + 1).
- A stateful function **destroy** to deallocate the counter.

One way to implement a ctr is to represent the state with a heap-allocated reference. This is what new\_counter does below:

```
fn new_counter ()
requires emp
returns c:ctr
ensures c.inv 0
    open Pulse.Lib.Box;
    let x = alloc 0;
    fn next (i:erased int)
    requires pts_to x i
    returns j:int
    ensures pts_to x (i + 1) ** pure (j == reveal i)
        let j = !x;
        x := j + 1;
        j
    };
    fn destroy (i:erased int)
    requires pts_to x i
    ensures emp
       free x
    let c = { inv = pts_to x; next; destroy };
    rewrite (pts_to x 0) as (c.inv 0);
    c
}
```

Here's how it works.

First, we allocate a new heap reference x initialized to 0.

Pulse allows us to define functions within any scope. So, we define two local functions next and destroy, whose implementations and specifications are straightforward. The important bit is that they capture the reference x:box int in their closure.

Finally, we package next and destroy into a c:ctr, instantiating inv to Box.pts\_to x, rewrite the context assertion to c.inv 0, and return c.

In a caller's context, such as test\_counter below, the fact that the counter is implemented using a single mutable heap reference is completely hidden.

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```
fn test_counter ()
requires emp
ensures emp
{
    let c = new_counter ();
    let next = c.next;
    let destroy = c.destroy;
    let x = next _; //FIXME: Should be able to write c.next
    assert pure (x == 0);
    let x = next _;
    assert pure (x == 1);
    destroy _;
}
```

### IMPLICATION AND UNIVERSAL QUANTIFICATION

In this chapter, we'll learn about two more separation logic connectives, @==> and forall\*. We show a few very simple examples using them, though these will be almost trivial. In the next chapter, on linked lists, we'll see more significant uses of these connectives.

# 40.1 Trades, or Separating Ghost Implication

The library module I = Pulse.Lib.Trade.Util defines the operator trade (@==>) and utilities for using it. In the literature, the operator p --\* q is pronounced "p magic-wand q"; p @==> q is similar, though there are some important technical differences, as we'll see. We'll just pronounce it p for q, p trade q, or p trades for q. Here's an informal description of what p @==> q means:

p @==> q says that if you have p then you can *trade* it for q. In other words, from p \*\* (p @==> q), you can derive q. This step of reasoning is performed using a ghost function I.elim with the signature below:

```
ghost
fn I.elim (p q:slprop)
requires p ** (p @==> q)
ensures q
```

Importantly, if you think of p as describing permission on a resource, the I.elim makes you *give up* the permission p and get q as a result. Note, during this step, you also lose permission on the implication, i.e., p @==> q lets you trade p for q just once.

But, how do you create a p @==> q in the first place? That's its introduction form, shown below:

That is, to introduce p = 0 q, one has to show hold permission r, such that a ghost function can transform r \*\* p into q.

#### 40.1.1 Share and Gather

Here's a small example to see p @==> q at work.

```
let regain_half #a (x:GR.ref a) (v:a) =
  pts_to x #0.5R v @==> pts_to x v
```

The predicate regain\_half says that you can trade a half-permission pts\_to x #one\_half v for a full permission pts\_to v. At first, this may seem counter-intuitive: how can you gain a full permission from half-permission. The thing to remember is that v ==> v itself holds permissions internally. In particular, regain\_half v holds exists\* v ==> v to v #one\_half v internally, such that if the context presents the other half, the eliminator can combine the two to return the full permission.

Let's look at how to introduce regain\_half:

```
ghost
fn intro_regain_half (x:GR.ref int)
requires pts_to x 'v
ensures pts_to x #0.5R 'v ** regain_half x 'v
{
    ghost
    fn aux ()
    requires pts_to x #0.5R 'v ** pts_to x #0.5R 'v
    ensures pts_to x 'v
    {
        GR.gather x;
    };
    GR.share x;
    I.intro _ _ _ aux;
    fold regain_half;
}
```

The specification says that if we start out with  $pts_t x v$  then we can split it into  $pts_t x w$  and a  $regain_half v$ . The normal way of splitting a permission a reference would split it into two halves—here, we just package the second half in a ghost function that allows us to gather the permission back when we need it.

In the implementation, we define an auxiliary ghost function that corresponds to the eliminator for pts\_to x #one\_half 'v @==> pts\_to x 'v—it's just a gather. Then, we split pts\_to x 'v into halves, call I.intro passing the eliminator, and the fold it into a regain\_half. All regain\_half has done is to package the ghost function aux, together the half permission on x, and put it into a slprop.

Later on, if want to use regain\_half, we can call its eliminator—which, effectively, calls aux with the needed permission, as shown below.

```
ghost
fn use_regain_half (x:GR.ref int)
requires pts_to x #0.5R 'v ** regain_half x 'v
ensures pts_to x 'v
{
  unfold regain_half;
  I.elim _ _;
}
```

At this point, you may be wondering why we bother to use a regain\_half x 'v in the first place, since one might as well have just used pts\_to x #one\_half 'v and gather, and you'd be right to wonder that! In this simple usage, the (@==>) hasn't bought us much.

# 40.2 Universal Quantification

Let's look at our regain\_half predicate again:

```
let regain_half #a (x:GR.ref a) (v:a) =
  pts_to x #0.5R v @==> pts_to x v
```

This predicate is not as general as it could be: to eliminate it, it requires the caller to prove that they holds pts\_to x #one\_half v, for the same v as was used when the trade was introduced.

One could try to generalize regain\_half a bit by changing it to:

```
let regain_half #a (x:GR.ref a) (v:a) =
   (exists* u. pts_to x #one_half u) @==> pts_to x v
```

This is an improvement, but it still is not general enough, since it does not relate v to the existentially bound u. What we really need is a universal quantifier.

Here's the right version of regain\_half:

```
let regain_half_q #a (x:GR.ref a) =
  forall* u. pts_to x #0.5R u @==> pts_to x u
```

This says that no matter what pts\_to x #one\_half u the context has, they can recover full permission to it, with the same witness u.

The forall\* quantifier and utilities to manipulate it are defined in Pulse.Lib.Forall.Util. The introduction and elimination forms have a similar shape to what we saw earlier for @==>:

```
ghost
fn FA.elim (#a:Type) (#p:a->slprop) (v:a)
requires (forall* x. p x)
ensures p v
```

The eliminator allows a *single* instantiation of the universally bound x to v.

```
ghost
fn FA.intro (#a:Type) (#p:a->slprop)
     (v:slprop)
     (f_elim : (x:a -> stt_ghost unit emp_inames v (fun _ -> p x)))
requires v
ensures (forall* x. p x)
```

The introduction form requires proving that one holds v, and that with v a ghost function can produce p x, for any x.

Note, it's very common to have universal quantifiers and trades together, so the library also provides the following combined forms:

```
ghost
fn elim_forall_imp (#a:Type0) (p q: a -> slprop) (x:a)
requires (forall* x. p x @==> q x) ** p x
ensures q x
```

and

## 40.2.1 Share and Gather, Again

Here's how one introduces regain\_half\_q:

```
ghost
fn intro_regain_half_q (x:GR.ref int)
requires pts_to x 'v
ensures pts_to x #0.5R 'v ** regain_half_q x
{
    ghost
    fn aux1 (u:int)
    requires pts_to x #0.5R 'v ** pts_to x #0.5R u
    ensures pts_to x u
    {
        gather x;
    };
    GR.share x;
    FA.intro_forall_imp _ _ _ aux1;
    fold regain_half_q;
}
```

Now, when we want to use it, we can trade in any half-permission on  $pts_to x #one_half u$ , for a full permission with the same u.

```
ghost
fn use_regain_half_q (x:GR.ref int)
requires pts_to x #0.5R 'u ** regain_half_q x
ensures pts_to x 'u
{
  unfold regain_half_q;
  FA.elim #_ #(fun u -> pts_to x #0.5R u @==> pts_to x u) 'u;
  I.elim _ _;
}
```

Note using the eliminator for FA.elim is quite verbose: we need to specify the quantifier term again. The way Pulse uses F\*'s unifier currently does not allow it to properly find solutions to some higher-order unification problems. We expect to fix this soon.

# 40.3 Trades and Ghost Steps

As a final example in this section, we show that one can use package any ghost computation into a trade, including steps that may modify the ghost state. In full generality, this makes @==> behave more like a view shift (in Iris terminology) than a wand.

Here's a predicate can\_update which says that one can trade a half permission to pts\_to x #one\_half u for a full permission to a *different value* pts\_to x v.

```
let can_update (x:GR.ref int) =
  forall* u v. pts_to x #0.5R u @==>
     pts_to x v
```

In make\_can\_update, we package a ghost-state update function into a binary quantifier forall\* u v. ....

```
ghost
fn make_can_update (x:GR.ref int)
requires pts_to x 'w
ensures pts_to x #0.5R 'w ** can_update x
{
  ghost
  fn aux (u:int)
  requires pts_to x #0.5R 'w
  ensures forall* v. pts_to x #0.5R u @==> pts_to x v
  {
   ghost
   fn aux (v:int)
   requires pts_to x #0.5R 'w ** pts_to x #0.5R u
   ensures pts_to x v
      gather x;
      x := v;
   };
   FA.intro_forall_imp _ _ aux;
  };
  share x;
  FA.intro _ aux;
  fold (can_update x);
}
```

And in update, below, we instantiate it to update the reference x from 'u to k, and also return back a can\_update predicate to the caller, for further use.

```
ghost
fn update (x:GR.ref int) (k:int)
requires pts_to x #0.5R 'u ** can_update x
ensures pts_to x #0.5R k ** can_update x
{
  unfold can_update;
  FA.elim #_ #(fun u -> forall* v. pts_to x #0.5R u @==> pts_to x v) 'u;
  FA.elim #_ #(fun v -> pts_to x #0.5R 'u @==> pts_to x v) k;
  I.elim __;
  make_can_update x;
}
```

Proof-Oriented Programming in F*

**CHAPTER** 

# **FORTYONE**

### **LINKED LISTS**

In this chapter, we develop a linked list library. Along the way, we'll see uses of recursive predicates, trades, and universal quantification.

# 41.1 Representing a Linked List

Let's start by defining the type of a singly linked list:

```
noeq
type node (t:Type0) = {
   head : t;
   tail : llist t;
}
and node_ptr (t:Type0) = ref (node t)

//A nullable pointer to a node
and llist (t:Type0) = option (node_ptr t)
```

A node t contains a head:t and a tail:llist t, a nullable reference pointing to the rest of the list. Nullable references are represented by an option, as we saw before.

Next, we need a predicate to relate a linked list to a logical representation of the list, for use in specifications.

```
let rec is_list #t (x:llist t) (l:list t)
: Tot slprop (decreases l)
= match l with
    | [] -> pure (x == None)
    | head::tl ->
        exists* (p:node_ptr t) (tail:llist t).
        pure (x == Some p) **
        pts_to p { head; tail } **
        is_list tail tl
```

The predicate is\_list x l is a recursive predicate:

- When 1 == [], the reference x must be null.
- Otherwise, 1 == head :: tl, x must contains a valid reference p, where p points to { head; tail } and, recursively, we have is\_list tail tl.

# 41.2 Boilerplate: Introducing and Eliminating is\_list

We've seen *recursive predicates in a previous chapter*, and just as we did there, we need some helper ghost functions to work with is\_list. We expect the Pulse checker will automate these boilerplate ghost lemmas in the future, but, for now, we are forced to write them by hand.

```
ghost
fn elim_is_list_nil (#t:Type0) (x:llist t)
requires is_list x 'l ** pure ('l == [])
ensures pure (x == None)
  rewrite each 'l as Nil #t;
  unfold (is_list x [])
ghost
fn intro_is_list_nil (#t:Type0) (x:llist t)
requires pure (x == None)
ensures is_list x []
{
   fold (is_list x []);
}
ghost
fn elim_is_list_cons (#t:Type0) (x:llist t) (l:list t) (head:t) (tl:list t)
requires is_list x l ** pure (l == head::tl)
ensures (
  exists* (p:node_ptr t) (tail:llist t).
   pure (x == Some p) **
   pts_to p { head; tail } **
   is_list tail tl
{
 rewrite each 1 as (head::tl);
 unfold (is_list x (head::tl));
fn intro_is_list_cons (#t:Type0) (x:llist t) (v:node_ptr t) (#node:node t) (#tl:list t)
requires
 pts_to v node **
 is_list node.tail tl **
 pure (x == Some v)
ensures
  is_list x (node.head::tl)
```

```
rewrite (pts_to v node) as (pts_to v { head=node.head; tail=node.tail });
fold (is_list x (node.head::tl));
}
```

# 41.3 Case analyzing a nullable pointer

When working with a linked list, the first thing we'll do, typically, is to check whether a given  $x:llist\ t$  is null or not. However, the  $is\_list\ x\ l$  predicate is defined by case analyzing  $l:list\ t$  rather than  $x:llist\ t$ , since that is makes it possible to write the predicate by recursing on the tail of l. So, below, we have a predicate  $lis\_list\_cases\ x\ l$  that inverts  $lis\_list\ x\ l$  predicate based on whether or not lis is null.

```
let is_list_cases #t (x:llist t) (l:list t)
: slprop
= match x with
    | None -> pure (l == [])
    | Some v ->
        exists* (n:node t) (tl:list t).
        pts_to v n **
        pure (l == n.head::tl) **
        is_list n.tail tl
```

Next, we define a ghost function to invert is\_list into is\_list\_cases.

```
ghost
fn cases_of_is_list #t (x:llist t) (1:list t)
requires is_list x l
ensures is_list_cases x 1
 match 1 {
    [] -> {
      unfold (is_list x []);
      fold (is_list_cases None 1);
      rewrite each (None #(ref (node t))) as x;
   }
   head :: tl -> {
      unfold (is_list x (head::tl));
      with w tail. _;
      let v = Some?.v x;
      rewrite each w as v;
      rewrite each tail as (({ head; tail }).tail) in (is_list tail tl);
      fold (is_list_cases (Some v) 1);
      rewrite each (Some #(ref (node t)) v) as x;
    }
  }
}
```

We also define two more ghost functions that package up the call to cases\_of\_is\_list.

```
requires is_list x l ** pure (x == None)
ensures is_list x l ** pure (l == [])
{
   cases_of_is_list x l;
   rewrite each x as (None #(ref (node t)));
   unfold (is_list_cases None l);
   fold (is_list x []);
}
```

```
ghost
fn is_list_case_some (#t:Type) (x:llist t) (v:node_ptr t) (#l:list t)
requires is_list x l ** pure (x == Some v)
ensures
  exists* (node:node t) (tl:list t).
   pts_to v node **
   is_list node.tail tl **
   pure (l == node.head::tl)
{
    cases_of_is_list x l;
   rewrite each x as (Some v);
   unfold (is_list_cases (Some v) l);
}
```

# 41.4 Length, Recursively

With our helper functions in hand, let's get to writing some real code, starting with a function to compute the length of an llist.

```
fn rec length (#t:Type0) (x:llist t)
requires is_list x 'l
returns n:nat
ensures is_list x 'l ** pure (n == List.Tot.length 'l)
{
 match x {
   None -> {
      is_list_case_none x;
      0
   Some vl -> {
      is_list_case_some x vl;
     let node = !vl;
      let n = length node.tail;
      intro_is_list_cons x vl;
      (1 + n)
   }
 }
```

The None case is simple.

Some points to note in the Some case:

- We use with \_node \_tl. \_ to "get our hands on" the existentially bound witnesses.
- After reading let node = !vl, we need is\_list node.tail \_tl to make the recursive call. But the context contains is\_list \_node.tail \_tl and node == \_node. So, we need a rewrite.
- We re-introduce the is\_list predicate, and return 1 + n. While the intro\_is\_list\_cons x vl is a ghost step and will be erased before execution, the addition is not—so, this function is not tail recursive.

### 41.5 Exercise 1

Write a tail-recursive version of length.

# 41.6 Exercise 2

Index the is\_list predicate with a fractional permission. Write ghost functions to share and gather fractional is\_list predicates.

# 41.7 Length, Iteratively, with Trades

What if we wanted to implement length using a while loop, as is more idiomatic in a language like C. It will take us a few steps to get there, and we'll use the trade operator (@==>) to structure our proof.

#### 41.7.1 Trade Tails

Our first step is to define tail\_for\_cons, a lemma stating that with permission on a node pointer (pts\_to v n), we can build a trade transforming a permission on the tail into a permission for a cons cell starting at the given node.

```
ghost
fn tail_for_cons (#t:Type) (v:node_ptr t) (#n:node t) (tl:erased (list t))
requires
  pts_to v n
ensures
  (is_list n.tail tl @==> is_list (Some v) (n.head::tl))
{
  ghost
  fn aux ()
  requires
    pts_to v n ** is_list n.tail tl
  ensures
    is_list (Some v) (n.head::tl)
  {
    intro_is_list_cons (Some v) v
  };
  I.intro _ _ _ aux;
}
```

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#### 41.7.2 Tail of a list

Next, here's a basic operation on a linked list: given a pointer to a cons cell, return a pointer to its tail. Here's a small diagram:

We're given a pointer x to the cons cell at the head of a list, and we want to return t1, the pointer to the next cell (or None, of x this is the end of the list). But, if we want to return a pointer to t1, we a permission accounting problem:

- We cannot return permission to x to the caller, since then we would have two *aliases* pointing to the next cell in the list: the returned tl and x -> next.
- But, we cannot consume the permission to **x** either, since we would like to return permission to **x** once the return t1 goes out of scope.

The solution here is to use a trade. The type of tail below says that if x is a non-null pointer satisfying is\_list x 'l, then tail returns a pointer y such that is\_list y tl (where tl is the tail of 'l); and, one can trade is\_list y tl to recover permission to is\_list x 'l. The trade essentially says that you cannot have permission to is\_list x 'l and is\_list y tl at the same time, but once you give up permission on y, you can get back the original permission on x.

```
fn tail (#t:Type) (x:llist t)
requires is_list x 'l ** pure (Some? x)
returns y:llist t
ensures exists* tl.
    is_list y tl **
    (is_list y tl @==> is_list x 'l) **
   pure (Cons? '1 /\ t1 == Cons?.tl '1)
{
   let np = Some?.v x;
   is_list_case_some x np;
   with node tl. _;
   let nd = !np;
   rewrite each node as nd;
   tail_for_cons np tl;
   nd.tail
}
```

### 41.7.3 length\_iter

The code below shows our iterative implementation of length. The basic idea is simple, though the proof takes a bit of doing. We initialize a current pointer cur to the head of the list; and ctr to 0. Then, while cur is not null, we move cur to the tail and increment ctr. Finally, we return the !ctr.

```
fn length_iter (#t:Type) (x: llist t)
requires is_list x 'l
returns n:nat
ensures is_list x 'l ** pure (n == List.Tot.length 'l)

(continues on next page)
```

```
{
  open I;
  let mut cur = x;
  let mut ctr = 0;
  I.refl (is_list x 'l); //initialize the trade for the invariant
  while (
   let v = !cur;
   Some? v
  )
  invariant b.
  exists* n ll suffix.
   pts_to ctr n **
   pts_to cur ll **
   is_list ll suffix **
   pure (n == List.Tot.length 'l - List.Tot.length suffix /\
          b == (Some? 11)) **
    (is_list ll suffix @==> is_list x 'l)
  {
   with _n _ll _suffix. _; //bind existential variables in the invariant
   let n = !ctr;
   let 11 = !cur;
   rewrite each _11 as 11; //again, rewrite the context to use 11 instead of _11
   let next = tail 11; //tail gives us back a trade
   with tl. _;
   I.trans (is_list next tl) _ _; //extend the trade, transitively
   cur := next;
   ctr := n + 1;
  }:
  with _n ll _sfx. _;
  is_list_case_none ll; //this tells us that suffix=[]; so n == List.Tot.length 'l
  I.elim _ _;
                       //regain ownership of x, giving up 11
  let n = !ctr;
  n
}
```

Now, for the proof. The main part is the loop invariant, which says:

- the current value of the counter is n;
- cur holds a list pointer, 11 where 11 contains the list represented by suffix;
- n is the length of the prefix of the list traversed so far;
- the loop continues as long as b is true, i.e., the list pointer 1 is not None;
- and, the key bit: you can trade ownership on 11 back for ownership on the original list x.

Some parts of this could be simplified, e.g., to avoid some of the rewrites.

One way to understand how trades have helped here is to compare length\_iter to the recursive function length. In length, after each recursive call returns, we called a ghost function to repackage permission on the cons cell after taking out permission on the tail. The recursive function call stack kept track of all these pieces of ghost code that had to be executed. In the iterative version, we use the trade to package up all the ghost functions that need to be run, rather than using the call stack. When the loop terminates, we use I.elim to run all that ghost code at once.

Of course, the recursive length is much simpler in this case, but this pattern of using trades to package up ghost functions is quite broadly useful.

# 41.8 Append, Recursively

Here's another recursive function on linked lists: append concatenates y on to the end of x.

It's fairly straightforward: we recurse until we reach the last node of x (i.e., the tail field is None; and we set that field to point to y.

```
fn rec append (#t:Type0) (x y:llist t)
requires is_list x 'l1 ** is_list y 'l2 ** pure (Some? x)
ensures is_list x ('l1 @ 'l2)
{
  let np = Some?.v x;
  is_list_case_some x np;
  with _node _tl. _;
  let node = !np;
  rewrite each _node as node;
  match node.tail {
   None -> {
      is_list_case_none None;
      elim_is_list_nil None;
      np := { node with tail = y };
      rewrite each y as ({ node with tail = y }).tail in (is_list y 'l2);
      intro_is_list_cons x np;
   }
   Some _ -> {
      append node.tail y;
      intro_is_list_cons x np;
   }
  }
}
```

The code is tail recursive in the Some \_ case, but notice that we have a ghost function call *after* the recursive call. Like we did for length, can we implement an iterative version of append, factoring this ghost code on the stack into a trade?

# 41.9 Append, Iteratively

Let's start by defining a more general version of the tail function from before. In comparison, the postcondition of tail\_alt uses a universal quantifier to say, roughly, that whatever list tl' the returns y points to, it can be traded for a pointer to x that cons's on to tl. Our previous function tail can be easily recovered by instantiating tl' to tl.

```
fn tail_alt (#t:Type) (x:llist t)
  requires is_list x 'l ** pure (Some? x)
  returns y:llist t
  ensures exists* hd tl.
    is_list y tl **
    (forall* tl'. is_list y tl' @==> is_list x (hd::tl')) **
    pure ('l == hd::tl)
{
    let np = Some?.v x;
    is_list_case_some x np;
    with _node _tl. _;
```

```
let node = !np;
rewrite each _node as node;
ghost
fn aux (tl':list t)
   requires pts_to np node ** is_list node.tail tl'
   ensures is_list x (node.head::tl')
{
    intro_is_list_cons x np;
};
FA.intro_forall_imp _ _ _ aux;
node.tail
}
```

We'll use these quantified trades in our invariant of append\_iter, shown below. The main idea of the implementation is to use a while loop to traverse to the last element of the first list x; and then to set y as the next pointer of this last element.

```
fn append_iter (#t:Type) (x y:llist t)
requires is_list x 'l1 ** is_list y 'l2 ** pure (Some? x)
ensures is_list x ('l1 @ 'l2)
 let mut cur = x;
  //the base case, set up the initial invariant
  FA.intro emp (fun l -> I.refl #[] (is_list x l));
  rewrite (forall* 1. is_list x 1 @==> is_list x 1)
      as (forall* 1. is_list x l @==> is_list x ([]@l));
  while (
   with _b ll pfx sfx. _;
   let 1 = !cur;
   rewrite each 11 as 1;
   let b = is_last_cell l; //check if we are at the last cell
   if b
   {
      false //yes, break out of the loop
   }
   else
     let next = tail_alt 1;
     with hd tl. _;
      (* this is the key induction step *)
      FA.trans_compose
          (is_list next) (is_list l) (is_list x)
          (fun tl -> hd :: tl)
          (fun tl -> pfx @ tl);
      //Use F* sugar for classical connectives to introduce a property
      //needed for the next rewrite
      (introduce forall tl. pfx @ (hd :: tl) == (pfx @ [hd]) @ tl
      with List.Tot.Properties.append_assoc pfx [hd] tl);
     rewrite (forall* tl. is_list next tl @==> is_list x (pfx@(hd::tl)))
           as (forall* tl. is_list next tl @==> is_list x ((pfx@[hd])@tl));
      cur := next;
      non_empty_list next; //need to prove that Some? next, for the invariant
```

```
true
   }
  )
  invariant b.
  exists* 11 pfx sfx.
   pts_to cur ll **
                       //cur holds the pointer to the current head of the traversal, 11
    is_list ll sfx ** //ll points to some suffix of the original list, since `pfx@sfx =
→'l1` below
   //the main bit: whatever ll points to `sfx', trade it for x pointing to the...
→concatenation ``pfx @ sfx'``
    (forall* sfx'. is_list ll sfx' @==> is_list x (pfx @ sfx')) **
      (b==false ==> List.Tot.length sfx == 1) / //the loop ends when we reach the last
⇔cell
     pfx@sfx == 'l1 / //sfx is really the suffix
                        //and the current list is always non-null
   )
  { () };
  with 11 pfx sfx. _;
  let last = !cur;
  rewrite each ll as last;
  append_at_last_cell last y;
  FA.elim_forall_imp (is_list last) (fun sfx' -> is_list x (pfx @ sfx')) (sfx@'l2);
  List.Tot.Properties.append_assoc pfx sfx '12;
  ()
}
```

There are few interesting points to note.

- The main part is the quantified trade in the invariant, which, as we traverse the list, encapsulates the ghost code that we need to run at the end to restore permission to the initial list pointer x.
- The library function, FA. trans\_compose has the following signature:

We use it in the key induction step as we move one step down the list—similar to what we had in length\_iter, but this time with a quantifier.

- Illustrating again that Pulse is a superset of pure F\*, we make use of a *bit of F\* sugar* in the introduce forall to prove a property needed for a Pulse rewrite.
- Finally, at the end of the loop, we use FA.elim\_forall\_imp to restore permission on x, now pointing to a concatenated list, effectively running all the ghost code we accumulated as we traversed the list.

Perhaps the lesson from all this is that recursive programs are much easier to write and prove correct that iterative ones? That's one takeaway. But, hopefully, you've seen how trades and quantifiers work and can be useful in some proofs—of course, we'll use them not just for rewriting recursive as iterative code.

### 41.9.1 Exercise 3

Write a function to insert an element in a list and a specific position.

### 41.9.2 Exercise 4

Write a function to reverse a list.

**CHAPTER** 

## **FORTYTWO**

### ATOMIC OPERATIONS AND INVARIANTS

In this section, we finally come to some concurrency related constructs.

Concurrency in Pulse is built around two concepts:

- **Atomic operations**: operations that are guaranteed to be executed in a single-step of computation without interruption by other threads.
- **Invariants**: named predicates that are enforced to be true at all times. Atomic operations can make use of invariants, assuming they are true in the current state, and enforced to be true again once the atomic step concludes.

Based on this, and in conjunction with all the other separation logic constructs that we've learned about so far, notably the use of ghost state, Pulse enables proofs of concurrent programs.

# **42.1 Atomic Operations**

We've learned so far about two kinds of Pulse computations:

- General purpose, partially correct computations, with the stt computation type
- Ghost computations, proven totally correct, and enforced to be computationally irrelevant with the stt\_ghost computation type.

Pulse offers a third kind of computation, *atomic* computations, with the stt\_atomic computation type. Here is the signature of read\_atomic and write\_atomic from Pulse.Lib.Reference:

```
atomic
fn read_atomic (r:ref U32.t) (#n:erased U32.t) (#p:perm)
requires pts_to r #p n
returns x:U32.t
ensures pts_to r #p n ** pure (reveal n == x)
```

```
atomic
fn write_atomic (r:ref U32.t) (x:U32.t) (#n:erased U32.t)
requires pts_to r n
ensures pts_to r x
```

The atomic annotation on these functions claims that reading and writing 32-bit integers can be done in a single atomic step of computation.

This is an assumption about the target architecture on which a Pulse program is executed. It may be that on some machines, 32-bit values cannot be read or written atomically. So, when using atomic operations, you should be careful to check that it is safe to assume that these operations truly are atomic.

Pulse also provides a way for you to declare that other operations are atomic, e.g., maybe your machine supports 64-bit or 128-bit atomic operations—you can program the semantics of these operations in  $F^*$  and add them to Pulse, marking them as atomic.

Sometimes, particularly at higher order, you will see atomic computations described by the computation type below:

```
val stt_atomic (t:Type) (i:inames) (pre:slprop) (post:t -> slprop)
: Type u#4
```

Like stt\_ghost, atomic computations are total and live in universe u#4. As such, you cannot store an atomic function in the state, i.e., ref (unit -> stt\_atomic t i p q) is not a well-formed type.

Atomic computations and ghost computations are also indexed by i:inames, where inames is a set of invariant names. We'll learn about these next.

#### 42.2 Invariants

In Pulse.Lib.Core, we have the following types:

```
[@@erasable]
val iref: Type0
val inv (i:iref) (p:slprop) : slprop
```

Think of inv i p as a predicate asserting that p is true in the current state and all future states of the program. Every invariant has a name, i:iref, though, the name is only relevant in specifications, i.e., it is erasable.

A closely related type is iname:

```
val iname : eqtype
let inames = erased (FStar.Set.set iname)
```

Every iref can be turned into an iname, with the function iname\_of (i:iref): GTot iname.

Invariants are duplicable, i.e., from inv i p one can prove inv i p \*\* inv i p, as shown by the type of Pulse. Lib.Core.dup\_inv below:

```
ghost fn dup_inv (i:iref) (p:slprop)
requires inv i p
ensures inv i p ** inv i p
```

# 42.2.1 Creating an invariant

Let's start by looking at how to create an invariant.

First, let's define a predicate owns x, to mean that we hold full-permission on x.

```
let owns (x:ref U32.t) : timeless_slprop = exists* v. pts_to x v
```

Now, if we can currently prove pts\_to r x then we can turn it into an invariant inv i (owns r), as shown below.

```
ghost
fn create_invariant (r:ref U32.t) (v:erased U32.t)
requires pts_to r v
returns i:iname
```

```
ensures inv i (owns r)
{
   fold owns;
   new_invariant (owns r)
}
```

Importantly, when we turn  $pts_to r x$  into inv i (owns r), we lose ownership of  $pts_to r x$ . Remember, once we have inv i (owns r), Pulse's logic aims to prove that owns r remains true always. If we were allowed to retain  $pts_to r x$ , while also creating an inv i (owns r), we can clearly break the invariant, e.g., by freeing r.

**Note:** A tip: When using an inv i p, it's a good idea to make sure that p is a user-defined predicate. For example, one might think to just write inv i (exists\* v. pts\_to x v) instead of defining an auxiliary predicate for inv i (owns r). However, the some of the proof obligations produced by the Pulse checker are harder for the SMT solver to prove if you don't use the auxiliary predicate and you may start to see odd failures. This is something we're working to improve. In the meantime, use an auxiliary predicate.

# 42.2.2 Impredicativity and the later modality

Pulse allows *any* predicate p:slprop to be turned into an invariant inv i p: slprop. Importantly, inv i p is itself an slprop, so one can even turn an invariant into another invariant, inv i (inv j p), etc. This ability to turn any predicate into an invariant, including invariants themselves, makes Pulse an *impredicative* separation logic.

Impredicativity turns out to be useful for a number of reasons, e.g., one could create a lock to protect access to a data structure that may itself contain further locks. However, soundly implementing impredicativity in a separation logic is challenging, since it involves resolving a kind of circularity in the definitions of heaps and heap predicates. PulseCore resolves this circularity using something called *indirection theory*, using it to provide a foundational model for impredicative invariants, together with all the constructs of Pulse. The details of this construction is out of scope here, but one doesn't really need to know how the construction of the model works to use the resulting logic.

We provide a bit of intuition about the model below, but for now, just keep in mind that Pulse includes the following abstract predicates:

```
val later (p:slprop) : slprop
val later_credit (i:nat) : slprop
```

with the following forms to introduce and eliminate them:

```
ghost fn later_intro (p: slprop)
requires p
ensures later p

ghost fn later_elim (p: slprop)
requires later p ** later_credit 1
ensures p

fn later_credit_buy (amt:nat)
requires emp
ensures later_credit n
```

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#### 42.2.3 Opening Invariants

Once we've allocated an invariant, inv i (owns r), what can we do with it? As we said earlier, one can make use of the owns r in an atomic computation, so long as we restore it at the end of the atomic step.

The with\_invariants construct gives us access to the invariant within the scope of at most one atomic step, preceded or succeeded by as many ghost or unobservable steps as needed.

The general form of with\_invariants is as follows, to "open" invariants i\_1 to i\_k in the scope of e.

```
with_invariants i_1 ... i_k
returns x:t
ensures post
{ e }
```

In many cases, the returns and ensures annotations are omitted, since it can be inferred.

This is syntactic sugar for the following nest:

```
with_invariants i_1 {
...
  with_invariants i_k
  returns x:t
  ensures post
  { e }
...
}
```

Here's the rule for opening a single invariant inv i pusing with\_invariant i { e } is as follows:

- i must have type iref and inv i p must be provable in the current context, for some p:slprop
- e must have the type stt\_atomic t j (later p \*\* r) (fun x -> later p \*\* s x). That is, e requires and restores later p, while also transforming r to s x, all in at most one atomic step. Further, the name\_of\_inv i must not be in the set j.
- with\_invariants i { e } has type stt\_atomic t (add\_inv i j) (inv i p \*\* r) (fun x -> inv i p \*\* s x). That is, e gets to use p for a step, and from the caller's perspective, the context was transformed from r to s, while the use of p is hidden.
- Pay attention to the add\_inv i j index on with\_invariants: stt\_atomic (or stt\_ghost) computation is indexed by the names of all the invariants that it may open.

Let's look at a few examples to see how with\_invariants works.

<sup>&</sup>lt;sup>1</sup> Alternatively e may have type stt\_ghost t j (later p \*\* r) (fun x -> later p \*\* s x), in which case the entire with\_invariants i { e } block has type stt\_ghost t (add\_inv i j) (inv i p \*\* r) (fun x -> inv i p \*\* s x), i.e., one can open an invariant and use it in either an atomic or ghost context.

#### Updating a reference

Let's try do update a reference, given inv i (owns r). Our first attempt is shown below:

We use with\_invariants i { ... } to open the invariant, and in the scope of the block, we have later (owns r). Now, we're stuck: we need later (owns r), but we only have later (owns r). In order to eliminate the later, we can use the later\_elim combinator shown earlier, but to call it, we need to also have a later\_credit 1.

So, let's try again:

- The precondition of the function also includes a later\_credit 1.
- At the start of the with\_invariants scope, we have later (owns r) in the context.
- The ghost step later\_elim \_ uses up the later credit and eliminates later (owns r) into owns r.
- The ghost step unfold owns unfolds it to its definition.
- Then, we do a single atomic action, write\_atomic.
- And follow it up with a fold owns, another ghost step.
- To finish the block, we need to restore later (owns r), but we have owns r, so the ghost step later\_intro does the job.
- The block within with\_invariants i has type stt\_atomic unit emp\_inames (later (owns r) \*\*
  later\_credit 1) (fun \_ -> later (owns r) \*\* emp)
- Since we opened the invariant i, the type of update\_ref\_atomic records this in the opens (singleton i) annotation; equivalently, the type is stt\_atomic unit (singleton i) (inv i (owns r) \*\* later\_credit 1) (fun \_ -> inv i (owns r)). When the opens annotation is omitted, it defaults to emp\_inames, the empty set of invariant names.

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Finally, to call update\_ref\_atomic, we need to buy a later credit first. This is easily done before we call the atomic computation, as shown below:

```
fn update_ref (r:ref U32.t) (i:iname) (v:U32.t)
requires inv i (owns r)
ensures inv i (owns r)
{
  later_credit_buy 1;
  update_ref_atomic r i v;
}
```

## 42.2.4 The later modality and later credits

Having seen an example with later modality at work, we provide a bit of intuition for the underlying model.

The semantics of PulseCore is defined with respect to memory with an abstract notion of a "ticker", a natural number counter, initialized at the start of a program's execution. In other logics, this is sometimes called a "step index", but in PulseCore, the ticker is unrelated to the number of actual steps a computation takes. Instead, at specific points in the program, the programmer can issue a specific *ghost* instruction to "tick" the ticker, decreasing its value by one unit. The decreasing counter provides a way to define an approximate fixed point between the otherwise-circular heaps and heap predicates. The logic is defined in such a way that it is always possible to pick a high enough initial value for the ticker so that any finite number of programs steps can be executed before the ticker is exhausted.

Now, rather than explicitly working with the ticker, PulseCore encapsulates all reasoning about the ticker using two logical constructs: the *later* modality and *later credits*, features found in Iris and other separation logics that feature impredicativity.

The predicate later p states that the p:slprop is true after one tick.

```
val later (p: slprop) : slprop
```

All predicates p:slprop are "hereditary", meaning that if they are true in a given memory, then they are also true after that memory is ticked. The ghost function later\_intro embodies this principle: from p one can prove later p.

```
ghost fn later_intro (p: slprop)
requires p
ensures later p
```

Given a later p, one can prove p by using later\_elim. This ghost function effectively "ticks" the memory (since later p says that p is true after a tick), but in order to do so, it needs a precondition that the ticker has not already reached zero: later\_credit 1 says just that, i.e., that the memory can be ticked at least once.

```
ghost fn later_elim (p: slprop)
requires later p ** later_credit 1
ensures p
```

The only way to get a later\_credit 1 is to *buy* a credit with the operation below—this is a concrete operation that ensures that the memory can be ticked at least n times.

```
fn later_credit_buy (amt:nat)
requires emp
ensures later_credit n
```

At an abstract level, if the ticker cannot be ticked further, the program loops indefinitely—programs that use later credits (and more generally in step indexed logics) are inherently proven only partially correct and are allowed to loop

infinitely. At a meta-level, we show that one can always set the initial ticker value high enough that later\_credit\_buy will never actually loop indefinitely. In fact, when compiling a program, Pulse extracts later\_credit\_buy n to a noop ().

Note, later credits can also be split and combined additively:

```
val later_credit_zero ()
: Lemma (later_credit 0 == emp)
val later_credit_add (a b: nat)
: Lemma (later_credit (a + b) == later_credit a ** later_credit b)
```

All predicates p:slprop are hereditary, meaning that p implies later p. Some predicates, including many common predicates like pts\_to are also **timeless**, meaning that later p implies p. Combining timeless predicates with \*\* or exisentially quantifying over timeless predicates yields a timeless predicate.

All of the following are available in Pulse.Lib.Core:

```
val timeless (p: slprop) : prop
let timeless_slprop = v:slprop { timeless v }
val timeless_emp : squash (timeless emp)
val timeless_pure (p:prop) : Lemma (timeless (pure p))
val timeless_star (p q : slprop) : Lemma
    (requires timeless p /\ timeless q)
    (ensures timeless (p ** q))
val timeless_exists (#a:Type u#a) (p: a -> slprop) : Lemma
    (requires forall x. timeless (p x))
    (ensures timeless (op_exists_Star p))
```

And in Pulse.Lib.Reference, we have:

```
val pts_to_timeless (#a:Type) (r:ref a) (p:perm) (x:a)
: Lemma (timeless (pts_to r #p x))
        [SMTPat (timeless (pts_to r #p x))]
```

For timeless predicates, the later modality can be eliminated trivially without requiring a credit.

```
ghost fn later_elim_timeless (p: timeless_slprop)
requires later p
ensures p
```

#### Updating a reference, with timeless predicates

Since pts\_to is timeless, we can actually eliminate later (owns r) without a later credit, as shown below.

First, we prove that owns is timeless:

```
let owns_timeless (x:ref U32.t)
: squash (timeless (owns x))
by T.(norm [delta_only [`%owns; `%auto_squash]];
         mapply (`FStar.Squash.return_squash);
        mapply (`timeless_exists))
= ()
```

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**Note:** It's usually easier to prove a predicate timeless by just annotating its definition, rather than writing an explicit lemma. For example, this would have worked:

```
let owns (x:ref U32.t) : timeless_slprop = exists* v. pts_to x v
```

Next, we can revise update\_ref\_atomic to use later\_elim\_timeless, rather than requiring a later credit.

## 42.2.5 Double opening is unsound

To see why we have to track the names of the opened invariants, consider the example below. If we opened the same invariant twice within the same scope, then it's easy to prove False:

```
[@expect_failure]
fn double_open_bad (r:ref U32.t) (i:inv (owns r))
requires emp
ensures pure False
{
    with_invariants i {
        unfold owns;
        unfold owns;
        pts_to_dup_impossible r;
        fold owns;
        fold owns;
    }
}
```

Here, we open the invariants i twice and get owns r \*\* owns r, or more than full permission to r—from this, it is easy to build a contradiction.

## 42.2.6 Subsuming atomic computations

Atomic computations can be silently converted to regular, stt computations, while forgetting which invariants they opened. For example, update\_ref below is not marked atomic, so its type doesn't record which invariants were opened internally.

```
fn update_ref (r:ref U32.t) (i:iname) (v:U32.t)
requires inv i (owns r)
ensures inv i (owns r)
{
  later_credit_buy 1;
  update_ref_atomic r i v;
}
```

This is okay, since a non-atomic computation can never appear within a with\_invariants block—so, there's no fear of an stt computation causing an unsound double opening. Attempting to use a non-atomic computation in a with\_invariants block produces an error, as shown below.

```
[@@expect_failure]
fn update_ref_fail (r:ref U32.t) (i:iname) (v:U32.t)
requires inv i (owns r)
ensures inv i (owns r)
{
   with_invariants i {
     unfold owns;
     r := v; //not atomic
     fold owns;
}
```

This computation is not atomic nor ghost. `with\_invariants` blocks can only contain atomic computations.

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**CHAPTER** 

# **FORTYTHREE**

## **SPIN LOCKS**

With atomic operations and invariants, we can build many useful abstractions for concurrency programming. In this chapter, we'll look at how to build a spin lock for mutual exclusion.

# 43.1 Representing a Lock

The main idea of the implementation is to represent a lock using a mutable machine word, where the value **0ul** signifies that the lock is currently released; and **1ul** signifies that the lock is currently acquired. To acquire a lock, we'll try to atomically compare-and-swap, repeating until we succeed in setting a **1ul** and acquiring the lock. Releasing the lock is simpler: we'll just set it to **0ul** (though we'll explore a subtlety on how to handle double releases).

From a specification perspective, a lock is lot like an invariant: the predicate type <code>lock\_alive 1 p</code> states that the lock protects some property p. Acquiring the lock provides p to the caller; while releasing the lock requires the caller to give up ownership of p. The runtime mutual exclusion is enforced by the acquire spinning, or looping, until the lock is available.

We'll represent a lock as a pair of reference to a U32.t and an invariant:

```
let maybe (b:bool) (p:slprop) =
   if b then p else emp

let lock_inv (r:B.box U32.t) (p:slprop) : slprop =
    exists* v. B.pts_to r v ** maybe (v = Oul) p

noeq
type lock = {
   r:B.box U32.t;
   i:iname;
}

let lock_alive (l:lock) (p:slprop) =
   inv l.i (lock_inv l.r p)
```

The predicate lock\_inv r p states:

- We hold full permission to the r:box U32.t; and
- If r contains Oul, then we also have p.

The lock itself pairs the concrete mutable state box U32.t with an invariant reference i:iref, where the lock\_alive 1 p predicate states that 1.i names an invariant for lock\_alive 1.r p.

# 43.2 Creating a lock

To create a lock, we implement new\_lock below. It requires the caller to provide p, ceding ownership of p to the newly allocated 1:lock

Some notes on the implementation:

- We heap allocate a reference using Box.alloc, since clearly, the lock has to live beyond the scope of this function's activation.
- We use new\_invariant to create an inv i (lock\_inv r p), and package it up with the newly allocated reference.

# 43.3 Duplicating permission to a lock

Locks are useful only if they can be shared between multiple threads. The lock\_alive 1 p expresses ownership of a lock—but, since lock\_alive is just an invariant, we can use dup\_inv to duplicate lock\_alive.

```
ghost
fn dup_lock_alive (l:lock) (p:slprop)
  requires lock_alive l p
  ensures lock_alive l p ** lock_alive l p
{
  unfold lock_alive;
  dup_inv l.i (lock_inv l.r p);
  fold lock_alive;
  fold lock_alive;
}
```

# 43.4 Acquiring a lock

The signature of acquire is shown below: it says that with lock\_alive 1 p, we can get back p without proving anything, i.e., the precondition is emp.

```
fn rec acquire (#p:slprop) (1:lock)
requires lock_alive l p
ensures lock_alive l p ** p
```

This may be seem surprising at first. But, recall that we've stashed p inside the invariant stored in the lock, and acquire is going to keep looping until such time as a CAS on the reference in the lock succeeds, allowing us to pull out p and return it to the caller.

The type of a compare-and-swap is shown below, from Pulse.Lib.Reference:

```
let cond b (p q:slprop) = if b then p else q
```

The specification of  $cas_box r u v$  says that we can try to atomically update r from u to v, and if the operation succeeds, we learn that the initial value (i) of r was equal to u.

Using cas\_box, we can implement acquire using a tail-recursive function:

```
unfold lock alive:
later_credit_buy 1;
let b =
  with_invariants l.i
    returns b:bool
    ensures later (lock_inv l.r p) ** maybe b p
    opens [l.i] {
    later_elim _;
    unfold lock_inv;
    let b = cas_box l.r Oul 1ul;
    if b
      elim_cond_true _ _ _;
      with _b. rewrite (maybe _b p) as p;
      fold (maybe false p);
      rewrite (maybe false p) as (maybe (1ul = 0ul) p);
      fold (lock_inv l.r p);
      fold (maybe true p);
      later_intro (lock_inv l.r p);
      true
    }
    else
      elim_cond_false _ _ _;
```

```
fold (lock_inv l.r p);
  fold (maybe false p);
  later_intro (lock_inv l.r p);
  false
  }
};
fold lock_alive;
if b { rewrite (maybe b p) as p; }
else { rewrite (maybe b p) as emp; acquire l }
}
```

The main part of the implementation is the with\_invariants block.

- Its return type b:bool and postcondition is inv 1.i (lock\_inv 1.r p) \*\* maybe b p, signifying that after a single cas, we may have p if the cas succeeded, while maintaining the invariant.
- We open 1.i to get lock\_inv, and then try a cas\_box 1.r Oul 1ul
- If the cas\_box succeeds, we know that the lock was initially in the Oul state. So, from lock\_inv we have p, and we can "take it out" of the lock and return it out of block as maybe true p. And, importantly, we can trivially restore the lock\_inv, since we know its currently value is 1ul, i.e., maybe (1ul = Oul) \_ == emp.
- If the cas\_box fails, we just restore lock\_inv and return false.

Outside the with\_invariants block, if the CAS succeeded, then we're done: we have p to return to the caller. Otherwise, we recurse and try again.

# 43.5 Exercise

Rewrite the tail-recursive acquire using a while loop.

# 43.6 Releasing a lock

Releasing a lock is somewhat easier, at least for a simple version. The signature is the dual of acquire: the caller has to give up p to the lock.

```
fn release (#p:slprop) (1:lock)
requires lock_alive l p ** p
ensures lock_alive l p
{
  unfold lock_alive;
  later_credit_buy 1;
  with_invariants l.i
    returns _:unit
    ensures later (lock_inv l.r p)
    opens [l.i] {
    later_elim _;
    unfold lock_inv;
    write_atomic_box l.r Oul;
    drop_ (maybe _ _); //maybe release without acquire
    fold (maybe (Oul = Oul) p);
```

```
fold (lock_inv l.r p);
  later_intro (lock_inv l.r p);
};
fold lock_alive
}
```

In this implementation, release unconditionally sets the reference to Oul and reproves the lock\_inv, since we have p in context.

However, if the lock was already in the released state, it may already hold p—releasing an already released lock can allow the caller to leak resources.

## 43.7 Exercise

Rewrite release to spin until the lock is acquired, before releasing it. This is not a particularly realistic design for avoiding a double release, but it's a useful exercise.

### 43.8 Exercise

Redesign the lock API to prevent double releases. One way to do this is when acquiring to lock to give out a permission to release it, and for release to require and consume that permission.

## 43.9 Exercise

Add a liveness predicate, with fractional permissions, to allow a lock to be allocated, then shared among several threads, then gathered, and eventually free'd.

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**CHAPTER** 

## **FORTYFOUR**

### PARALLEL INCREMENT

In this chapter, we look at an example first studied by Susan Owicki and David Gries, in a classic paper titled Verifying properties of parallel programs: an axiomatic approach. The problem involves proving that a program that atomically increments an integer reference r twice in parallel correctly adds 2 to r. There are many ways to do this—Owicki & Gries' approach, adapted to a modern separation logic, involves the use of additional ghost state and offers a modular way to structure the proof.

While this is a very simple program, it captures the essence of some of the reasoning challenges posed by concurrency: two threads interact with a shared resource, contributing to it in an undetermined order, and one aims to reason about the overall behavior, ideally without resorting to directly analyzing each of the possible interleavings.

#### 44.1 Parallel Blocks

Pulse provides a few primitives for creating new threads. The most basic one is parallel composition, as shown below:

```
parallel
requires p1 and p2
ensures q1 and q2
{ e1 }
{ e2 }
```

The typing rule for this construct requires:

```
val e1 : stt a p1 q1
val e2 : stt b p2 q2
```

and the parallel block then has the type:

```
stt (a & b) (p1 ** p2) (fun (x, y) -> q1 x ** q2 y)
```

In other words, if the current context can be split into separate parts p1 and p2 satisfying the preconditions of e1 and e2, then the parallel block executes e1 and e2 in parallel, waits for both of them to finish, and if they both do, returns their results as a pair, with their postconditions on each component.

Using parallel, one can easily program the par combinator below:

```
{
  parallel
  requires pf and pg
  ensures qf and qg
  { f () }
  { g () };
  ()
}
```

As we saw in the *introduction to Pulse*, it's easy to increment two separate references in parallel:

But, what if we wanted to increment the same reference in two separate threads? That is, we wanted to program something like this:

But, this program doesn't check. The problem is that we have only a single  $pts\_to x 'i$ , and we can't split it to share among the threads, since both threads require full permission to x to update it.

Further, for the program to correctly add 2 to x, each increment operations must take place atomically, e.g., if the two fragments below were executed in parallel, then they may both read the initial value of x first, bind it to v, and then both update it to v + 1.

Worse, without any synchronization, on modern processors with weak memory models, this program could exhibit a variety of other behaviors.

To enforce synchronization, we could use a lock, e.g., shown below:

```
fn attempt (x:ref int)
requires pts_to x 'i
ensures exists* v. pts_to x v
{
   let l = L.new_lock (exists* v. pts_to x v);
   fn incr ()
   requires L.lock_alive l #0.5R (exists* v. pts_to x v)
   ensures L.lock_alive l #0.5R (exists* v. pts_to x v)
{
```

```
L.acquire 1;
  let v = !x;
  x := v + 1;
  L.release 1
};
L.share 1;
par incr incr;
L.gather 1;
L.acquire 1;
L.free 1
}
```

This program is type correct and free from data races. But, since the lock holds the entire permission on x, there's no way to give this function a precise postcondition.

**Note:** In this section, we use an implementation of spin locks from the Pulse library, Pulse.Lib.SpinLock. Unlike the version we developed in the previous chapter, these locks use a fraction-indexed permission, lock\_alive 1 #f p. The also provide a predicate, lock\_acquired 1, that indicates when the lock has been taken. With full-permission to the lock, and lock\_acquired 1, the lock can be freed—reclaiming the underlying memory. Additionally, the lock\_acquired predicate ensures that locks cannot be double freed. As such, Pulse.Lib.SpinLock fixes the problems with the spin locks we introduced in the previous chapter and also provides a solution to the exercises given there.

# 44.2 A First Take, with Locks

Owicki and Gries' idea was to augment the program with auxiliary variables, or ghost state, that are purely for specification purposes. Each thread gets its own piece of ghost state, and accounts for how much that thread has contributed to the current value of shared variable. Let's see how this works in Pulse.

The main idea is captured by lock\_inv, the type of the predicate protected by the lock:

```
let contributions (left right: GR.ref int) (i v:int) : timeless_slprop =
    exists* (vl vr:int).
    GR.pts_to left #0.5R vl **
    GR.pts_to right #0.5R vr **
    pure (v == i + vl + vr)

let lock_inv (x:ref int) (init:int) (left right:GR.ref int) : timeless_slprop =
    exists* v.
    pts_to x v **
    contributions left right init v
```

Our strawman lock in the attempt shown before had type lock (exists\* v. pts\_to x v). This time, we add a conjunct that refines the value v, i.e., the predicate contributions l r init v says that the current value of x protected by the lock (i.e., v) is equal to init + vl + vr, where init is the initial value of x; vl is the value of the ghost state owned by the "left" thread; and vr is the value of the ghost state owned by the "right" thread. In other words, the predicate contributions l r init v shows that v always reflects the values of the contributions made by each thread.

Note, however, the contributions predicate only holds half-permission on the left and right ghost variables. The

other half permission is held outside the lock and allows us to keep track of each threads contribution in our specifications.

Here's the code for the left thread, incr left:

```
fn incr_left (x:ref int)
             (#p:perm)
             (#left:GR.ref int)
             (#right:GR.ref int)
             (#i:erased int)
             (lock:L.lock)
requires L.lock_alive lock #p (lock_inv x i left right) ** GR.pts_to left #0.5R 'vl
ensures L.lock_alive lock #p (lock_inv x i left right) ** GR.pts_to left #0.5R ('vl + 1)
  L.acquire lock;
  unfold lock_inv;
  unfold contributions;
  let v = !x;
  x := v + 1;
  GR.gather left;
  GR.write left ('vl + 1);
  GR.share left;
  fold (contributions left right i (v + 1));
  fold lock_inv;
  L.release lock
```

- Its arguments include x and the lock, but also both pieces of ghost state, left and right, and an erased value i for the initial value of x.
- Its precondition holds half permission on the ghost reference left
- Its postcondition returns half-permission to left, but proves that it was incremented, i.e., the contribution of the left thread to the value of x increased by 1.

Notice that even though we only had half permission to left, the specifications says we have updated left—that's because we can get the other half permission we need by acquiring the lock.

- We acquire the lock and update increment the value stored in x.
- And then we follow the increment with several ghost steps:
  - Gain full permission on left by combining the half permission from the precondition with the half permission gained from the lock.
  - Increment left.
  - Share it again, returning half permission to the lock when we release it.
- Finally, we GR.pts\_to left #one\_half (`vl + 1) left over to return to the caller in the postcondition.

The code of the right thread is symmetrical, but in this, our first take, we have to essentially repeat the code—we'll see how to remedy this shortly.

```
(lock:L.lock)
requires L.lock_alive lock #p (lock_inv x i left right) ** GR.pts_to right #0.5R 'vl
ensures L.lock_alive lock #p (lock_inv x i left right) ** GR.pts_to right #0.5R ('vl + 1)
{
    L.acquire lock;
    unfold lock_inv;
    unfold contributions;
    let v = !x;
    x := v + 1;
    GR.gather right;
    GR.write right ('vl + 1);
    GR.share right;
    fold (contributions left right i (v + 1));
    fold (lock_inv x i left right);
    L.release lock
}
```

Finally, we can implement add2 with the specification we want:

```
fn add2 (x:ref int)
requires pts_to x 'i
ensures pts_to x ('i + 2)
  let left = GR.alloc 0;
 let right = GR.alloc 0;
  GR.share left;
  GR.share right;
  fold (contributions left right 'i 'i);
  fold (lock_inv x 'i left right);
  let lock = L.new_lock (lock_inv x 'i left right);
  L.share lock;
  par (fun _ -> incr_left x lock)
      (fun _ -> incr_right x lock);
  L.gather lock;
  L.acquire lock;
  L.free lock:
  unfold lock_inv;
  unfold contributions;
  GR.gather left;
  GR.gather right;
  GR.free left;
  GR.free right;
}
```

- We allocate left and right ghost references, initializing them to 0.
- Then we split them, putting half permission to both in the lock, retaining the other half.
- Then spawn two threads for incr\_left and incr\_right, and get as a postcondition that contributions of both threads and increased by one each.
- Finally, we acquire the lock, get pts\_to x v, for some v, and contributions left right i v. Once we gather up the permission on left and right, and now the contributions left right i v tells us that v == i + 1 + 1, which is what we need to conclude.

# 44.3 Modularity with higher-order ghost code

Our next attempt aims to write a single function incr, rather than incr\_left and incr\_right, and to give incr a more abstract, modular specification. The style we use here is based on an idea proposed by Bart Jacobs and Frank Piessens in a paper titled Expressive modular fine-grained concurrency specification.

The main idea is to observe that incr\_left and incr\_right only differ by the ghost code that they execute. But, Pulse is higher order: so, why not parameterize a single function by incr and let the caller instantiate incr twice, with different bits of ghost code. Also, while we're at it, why not also generalize the specification of incr so that it works with any user-chosen abstract predicate, rather than contributions and left/right ghost state. Here's how:

```
fn incr (x: ref int)
        (#p:perm)
        (#refine #aspec: int -> slprop)
        (1:L.lock)
        (ghost_steps:
          (v:int -> vq:int -> stt_ghost unit
               emp_inames
               (refine v ** aspec vq ** pts_to x (v + 1))
               (fun _ -> refine (v + 1) ** aspec (vq + 1) ** pts_to x (v + 1))))
requires L.lock_alive 1 #p (exists* v. pts_to x v ** refine v) ** aspec 'i
ensures L.lock_alive l #p (exists* v. pts_to x v ** refine v) ** aspec ('i + 1)
   L.acquire 1;
   with _v. _;
   let vx = !x;
   rewrite each _v as vx;
   x := vx + 1;
   ghost_steps vx 'i;
   L.release 1;
}
```

As before, incr requires x and the lock, but, this time, it is parameterized by:

- A predicate refine, which generalizes the contributions predicate from before, and refines the value that x points to.
- A predicate aspec, an abstract specification chosen by the caller, and serves as the main specification for incr, which transitions from aspec 'i to aspec ('i + 1).
- And, finally, the ghost function itself, ghost\_steps, now specified abstractly in terms of the relationship between refine, aspec and pts\_to x—it says, effectively, that once x has been updated, the abstract predicates refine and aspec can be updated too.

Having generalized incr, we've now shifted the work to the caller. But, incr, now verified once and for all, can be used with many different callers just by instantiating it differently. For example, if we wanted to do a three-way parallel increment, we could reuse our incr as is. Whereas, our first take would have to be completely revised, since incr\_left and incr\_right assume that there are only two ghost references, not three.

Here's one way to instantiate incr, proving the same specification as add2.

```
let right = GR.alloc 0;
GR.share left;
GR.share right;
fold (contributions left right 'i 'i);
let lock = L.new_lock (
  exists* (v:int).
    pts_to x v ** contributions left right 'i v
);
ghost
fn step
    (lr:GR.ref int)
    (b:bool { if b then lr == left else lr == right })
    (v vq:int)
  requires
    contributions left right 'i v **
    GR.pts_to lr #0.5R vq **
   pts_to x (v + 1)
  ensures
    contributions left right 'i (v + 1) **
    GR.pts_to lr #0.5R (vq + 1) **
   pts_to x (v + 1)
  unfold contributions;
   with _p _v. rewrite (GR.pts_to lr #_p _v) as (GR.pts_to left #_p _v);
    GR.gather left;
    GR.write left (vq + 1);
    GR.share left:
   with _p _v. rewrite (GR.pts_to left #_p _v) as (GR.pts_to lr #_p _v);
    fold (contributions left right 'i (v + 1));
  }
  else
   with _p _v. rewrite (GR.pts_to lr #_p _v) as (GR.pts_to right #_p _v);
    GR.gather right;
    GR.write right (vq + 1);
   GR.share right;
   with _p _v. rewrite (GR.pts_to right #_p _v) as (GR.pts_to lr #_p _v);
    fold (contributions left right 'i (v + 1));
  }
};
L.share lock;
par (fun _ -> incr x lock (step left true))
    (fun _ -> incr x lock (step right false));
L.gather lock;
L.acquire lock;
L.free lock;
unfold (contributions left right 'i);
GR.gather left;
GR.gather right;
GR.free left;
```

```
GR.free right;
}
```

The code is just a rearrangement of what we had before, factoring the ghost code in incr\_left and incr\_right into a ghost function step. When we spawn our threads, we pass in the ghost code to either update the left or the right contribution.

This code still has two issues:

- The ghost step function is a bloated: we have essentially the same code and proof twice, once in each branch of the conditional. We can improve this by defining a custom bit of ghost state using Pulse's support for partial commutative monoids—but that's for another chapter.
- We allocate and free memory for a lock, which is inefficient—could we instead do things with atomic operations? We'll remedy that next.

#### 44.3.1 Exercise

Instead of explicitly passing a ghost function, use a quantified trade.

#### 44.4 A version with invariants

As a final example, in this section, we'll see how to program add2 using invariants and atomic operations, rather than locks.

Doing this properly will require working with bounded, machine integers, e.g., U32.t, since these are the only types that support atomic operations. However, to illustrate the main ideas, we'll assume two atomic operations on unbounded integers—this will allow us to not worry about possible integer overflow. We leave as an exercise the problem of adapting this to U32.t.

### 44.4.1 Cancellable Invariants

The main idea of doing the add2 proof is to use an invariant instead of a lock. Just as in our previous code, add2 starts with allocating an invariant, putting exists\* v.  $pts_to x v ** contribution left right i v in the invariant. Then call incr twice in different threads. However, finally, to recover <math>pts_to x (v + 2)$ , where previously we would acquire the lock, with a regular invariant, we're stuck, since the  $pts_to x v$  permission is inside the invariant and we can't take it out to return to the caller.

An invariant inv i p guarantees that the property p is true and remains true for the rest of a program's execution. But, what if we wanted to only enforce p as an invariant for some finite duration, and then to cancel it? This is what the library Pulse.Lib.CancellableInvariant provides. Here's the relevant part of the API:

```
[@@ erasable]
val cinv : Type0
val iref_of (c:cinv) : GTot iref
```

The main type it offers is cinv, the name of a cancellable invariant.

```
ghost
fn new_cancellable_invariant (v:boxable)
requires v
returns c:cinv
ensures inv (iref_of c) (cinv_vp c v) ** active c 1.0R
```

Allocating a cancellable invariant is similar to allocating a regular invariant, except one gets an invariant for an abstract predicate cinv\_cp c v, and a fraction-indexed predicate active c 1.0R which allows the cancellable invariant to be shared and gathered between threads.

The cinv\_cp c v predicate can be used in conjunction with active to recover the underlying predicate v—but only when the invariant has not been cancelled yet—this is what unpack\_cinv\_vp, and its inverse, pack\_cinv\_vp, allow one to do.

```
ghost
fn unpack_cinv_vp (#p:perm) (#v:slprop) (c:cinv)
requires cinv_vp c v ** active c p
ensures v ** unpacked c ** active c p

ghost
fn pack_cinv_vp (#v:slprop) (c:cinv)
requires v ** unpacked c
ensures cinv_vp c v
```

Finally, if one has full permission to the invariant (active c 1.0R) it can be cancelled and the underlying predicate v can be obtained as postcondition.

```
ghost
fn cancel (#v:slprop) (c:cinv)
requires inv (iref_of c) (cinv_vp c v) ** active c 1.0R
ensures v
opens add_inv emp_inames (iref_of c)
```

## 44.4.2 An increment operation

Our first step is to build an increment operation from an atomic\_read and a cas. Here is its specification:

The style of specification is similar to the generic style we used with incr, except now we use cancellable invariant instead of a lock.

For its implementation, the main idea is to repeatedly read the current value of x, say v; and then to cas in v+1 if the current value is still v.

The read function is relatively easy:

```
atomic
 fn read ()
 requires inv (C.iname_of c) (C.cinv_vp c (exists* v. pts_to x v ** refine v)) ** C.
→active c p ** later_credit 1
 opens [C.iname_of c]
 returns v:int
 ensures inv (C.iname_of c) (C.cinv_vp c (exists* v. pts_to x v ** refine v)) ** C.
→active c p
 {
   with_invariants (C.iname_of c)
   {
       later_elim _;
       C.unpack_cinv_vp #p c;
       let v = atomic_read x;
       C.pack_cinv_vp #(exists* v. pts_to x v ** refine v) c;
       later_intro (C.cinv_vp c (exists* v. pts_to x v ** refine v));
   }
 };
```

• We open the invariant 1; then, knowing that the invariant is still active, we can unpack`it; then read the value v; pack it back; and return v.

The main loop of incr\_atomic is next, shown below:

```
let mut continue = true;
fold (cond true (aspec 'i) (aspec ('i + 1)));
while (
   with _b. _;

(continues on pext page)
```

```
let b = !continue;
  rewrite each _b as b;
)
invariant b.
  inv (C.iname_of c) (C.cinv_vp c (exists* v. pts_to x v ** refine v)) **
  pts_to continue b **
  C.active c p **
  cond b (aspec 'i) (aspec ('i + 1))
  later_credit_buy 1;
  let v = read ();
  later_credit_buy 1;
  let next =
    with_invariants (C.iname_of c)
    returns b1:bool
    ensures later (C.cinv_vp c (exists* v. pts_to x v ** refine v))
        ** cond b1 (aspec 'i) (aspec ('i + 1))
        ** pts_to continue true
        ** C.active c p
      later_elim _;
      C.unpack_cinv_vp c;
      unfold cond;
      let b = cas x v (v + 1);
      if b
        unfold cond;
        with vv. assert (refine vv);
        f vv _;
        C.pack_cinv_vp #(exists* v. pts_to x v ** refine v) c;
        fold (cond false (aspec 'i) (aspec ('i + 1)));
        later_intro (C.cinv_vp c (exists* v. pts_to x v ** refine v));
        false
      }
      else
        unfold cond;
        C.pack_cinv_vp #(exists* v. pts_to x v ** refine v) c;
        fold (cond true (aspec 'i) (aspec ('i + 1)));
        later_intro (C.cinv_vp c (exists* v. pts_to x v ** refine v));
        true
      }
    };
  continue := next
};
```

The loop invariant says:

- the invariant remains active
- the local variable continue determines if the loop iteration continues
- and, so long as the loop continues, we still have aspec 'i, but when the loop ends we have aspec ('i + 1)

The body of the loop is also interesting and consists of two atomic operations. We first read the value of x into v. Then we open the invariant again try to cas in v+1. If it succeeds, we return false from the with\_invariants block; otherwise true. And, finally, outside the with\_invariants block, we set the continue variable accordingly. Recall that with\_invariants allows at most a single atomic operation, so we having done a cas, we are not allowed to also set continue inside the with\_invariants block.

## 44.4.3 add2\_v3

Finally, we implement our parallel increment again, add2\_v3, this time using invariants, though it has the same specification as before.

```
fn add2_v3 (x: ref int)
requires pts_to x 'i
ensures pts_to x ('i + 2)
   let left = GR.alloc 0;
   let right = GR.alloc 0;
   GR.share left:
   GR.share right;
   fold (contributions left right 'i 'i);
   let c = C.new_cancellable_invariant (
      exists* (v:int).
          pts_to x v **
          contributions left right 'i v
   );
   ghost
    fn step
        (lr:GR.ref int)
        (b:bool { if b then lr == left else lr == right })
        (v vq:int)
      requires
        contributions left right 'i v **
        GR.pts_to lr #0.5R vq **
        pts_to x (v + 1)
      ensures
        contributions left right 'i (v + 1) **
        GR.pts_to lr #0.5R (vq + 1) **
       pts_to x (v + 1)
    {
      unfold contributions;
      if b
        with _p _v. rewrite (GR.pts_to lr #_p _v) as (GR.pts_to left #_p _v);
        GR.gather left;
        GR.write left (vq + 1);
        GR.share left;
        with _p _v. rewrite (GR.pts_to left #_p _v) as (GR.pts_to lr #_p _v);
        fold (contributions left right 'i (v + 1));
      }
      else
      {
        with _p _v. rewrite (GR.pts_to lr #_p _v) as (GR.pts_to right #_p _v);
        GR.gather right;
```

```
GR.write right (vq + 1);
        GR.share right;
       with _p _v. rewrite (GR.pts_to right #_p _v) as (GR.pts_to lr #_p _v);
        fold (contributions left right 'i (v + 1));
     }
   };
   C.share c;
   with pred. assert (inv (C.iname_of c) (C.cinv_vp c (exists* v. pts_to x v ** pred_
→v)));
   dup_inv (C.iname_of c) (C.cinv_vp c (exists* v. pts_to x v ** pred v));
   par (fun _ -> incr_atomic x c (step left true))
        (fun _ -> incr_atomic x c (step right false));
   C.gather c;
   later_credit_buy 1;
   C.cancel c:
   unfold contributions;
   GR.gather left;
   GR.gather right;
   GR.free left;
   GR.free right;
   drop_ (inv _ _)
}
```

The code too is very similar to add2\_v2, except instead of allocating a lock, we allocate a cancellable invariant. And, at the end, instead of acquiring, and leaking, the lock, we simply cancel the invariant and we're done.

# 44.5 Exercise

Implement add2 on a ref U32.t. You'll need a precondition that 'i + 2 < pow2 32 and also to strengthen the invariant to prove that each increment doesn't overflow.

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**CHAPTER** 

# **FORTYFIVE**

# **EXTRACTION**

Pulse programs can be extracted to OCaml, C, and Rust. We illustrate the extraction capabilities with the help of the Boyer-Moore majority vote algorithm implemented in Pulse.

# 45.1 Boyer-Moore majority vote algorithm

The algorithm finds majority vote in an array of votes in linear time (2n comparisons, where n is the length of the array) and constant extra memory.

We implement the algorithm in Pulse with the following specification:

```
let count (#a:eqtype) (x:a) (s:Seq.seq a) : GTot nat = Seq.count x s

noextract
let has_majority_in (#a:eqtype) (x:a) (s:Seq.seq a) = Seq.length s < 2 * count x s

noextract
let no_majority (#a:eqtype) (s:Seq.seq a) = forall (x:a). ~(x `has_majority_in` s)

fn majority
  (#[@@@ Rust_generics_bounds ["Copy"; "PartialEq"]] a:eqtype)
  #p (#s:G.erased _) (votes:array a) (len:SZ.t { SZ.v len == Seq.length s })
  requires pts_to votes #p s ** pure (0 < SZ.v len /\ SZ.fits (2 * SZ.v len))
  returns x:option a
  ensures pts_to votes #p s **
      pure ((x == None ==> no_majority s) /\ (Some? x ==> (Some?.v x) `has_majority_
in` s))
```

The precondition SZ.fits (2 \* SZ.v len) ensures safe arithmetic when counting for majority.

The algorithm consists of two phases. The first phase, called the pairing phase, pairs off disagreeing votes (cancels them) until the remaining votes are all same. The main idea of the algorithm is to do this pairing with n comparisons. After the pairing phase, the remaining vote must be the majority, *if the majority exists*. The second phase, called the counting phase, checks if the remaining vote is indeed in majority with n more comparisons.

For the first phase, the algorithm maintains three auxiliary variables, i for the loop counter, cand the current majority candidate, and a count k. It visits the votes in a loop, where for the i-th element of the array, if k = 0, the algorithm assigns the i-th vote as the new majority candidate and assigns k = 1. Otherwise, if the i-th vote is same as cand, it increments k by one, otherwise it decrements k by one.

The second phase then is another while loop that counts the number of votes for the majority candidate from the first phase.

```
let mut i = 1sz;
 let mut k = 1sz;
 let votes_0 = votes.(0sz);
 let mut cand = votes_0;
 assert (pure (count_until votes_0 s 1 == 1));
 // while loop for phase 1
 while (
   let vi = !i;
   (vi <^ len)
 )
 invariant b.
   pts_to votes #p s **
   (exists* vi vk vcand.
      R.pts_to i vi
                           **
      R.pts_to k vk
      R.pts_to cand vcand **
      pure (
        v vi <= Seq.length s /\
        // v is a spec function that returns nat representation of an FStar.SizeT
        0 \le v \ vk / \ v \ vk \le count\_until \ vcand \ s \ (v \ vi) / \
        // constraint for the current candidate,
        2 * (count_until vcand s (v vi) - v vk) <= v vi - v vk /\
        // constraint for the rest of the candidates
        (forall (vcand':a). vcand' =!= vcand ==> 2 * count_until vcand' s (v vi) <= v_u
⇒vi - v vk) /\
        b == (v vi < v len))
   let vi = !i;
   let vk = !k;
   let vcand = !cand;
   let votes_i = votes.(vi);
   // count_until_next is a lemma that captures the behavior of
   // count when the sequence index is incremented
   count_until_next vcand s (SZ.v vi);
   if (vk = 0sz) {
     cand := votes_i;
     k := 1sz;
     i := vi +^ 1sz
   } else if (votes_i = vcand) {
     k := vk +^{\Lambda} 1sz;
     i := vi +^ 1sz
   } else {
     k := vk -^{1}sz;
     i := vi +^ 1sz
   }
 };
 let vk = !k;
 let vcand = !cand;
 // a couple of optimizations
 if (vk = 0sz) {
   None
 } else if (len <^ 2sz *^ vk) {</pre>
```

```
Some vcand
  } else {
    i := 0sz;
    k := 0sz;
    // while loop for phase 2
    while (
      let vi = !i;
      (vi <^ len)
    )
    invariant b.
      pts_to votes #p s **
      (exists* vi vk.
         R.pts_to i vi **
         R.pts_to k vk **
         pure (SZ.v vi <= Seq.length s /\</pre>
               SZ.v vk == count_until vcand s (SZ.v vi) /\
               b == (SZ.v vi < SZ.v len)))
    {
      let vi = !i;
      let vk = !k;
      let votes_i = votes.(vi);
      count_until_next vcand s (SZ.v vi);
      if (votes_i = vcand) {
        k := vk +^{\Lambda} 1sz;
        i := vi +^ 1sz
      } else {
        i := vi +^ 1sz
      }
    };
    let vk = !k;
    if (len <^ 2sz *^ vk) {
      Some vcand
    } else {
      None
    }
 }
}
```

The loop invariant for the first phase specifies majority constraints *within* the prefix of the array that the loop has visited so far. The second phase loop invariant is a simple counting invariant.

Pulse automatically proves the program, with an hint for the behavior of the count function as we increment the loop counter, the following count\_until\_next lemma captures the behavior, and we invoke the lemma in both the while loops:

# 45.2 Rust extraction

Pulse toolchain is accompanied with a tool to extract Pulse programs to Rust. The extraction pipeline maps the Pulse syntactic constructs such as let mut, while, if-then-else, etc. to corresponding Rust constructs. Further, Pulse libraries are mapped to their Rust counterparts, e.g. Pulse.Lib.Vec to std::vec, Pulse.Lib.Array to Rust slices etc.

To extract a Pulse file to Rust, we first invoke the F\* extraction pipeline with the command line option --codegen Extension. This emits a .ast file containing an internal AST representation of the file. We then invoke the Rust extraction tool that takes as input the .ast files and outputs the extracted Rust code (by-default the output is written to stdout, if an -o <file> option is provided to the tool, the output is written to file). For example, the first command produces the .ast file from PulseTutorial.Algorithms.fst (which contains the Boyer-Moore algorithm implementation), and then the second command extracts the Rust code to voting.rs. (These commands are run in the pulse root directory, change the location of main.exe according to your setup.)

```
$ fstar.exe --include lib/pulse/ --include lib/pulse/lib
   --include share/pulse/examples/by-example/ --include share/pulse/examples/_output/
   --cache/
   --load_cmxs pulse --odir . PulseTutorial.Algorithms.fst
   --extract 'PulseTutorial.Algorithms' --codegen Extension
$ ./pulse2rust/main.exe PulseTutorial_Algorithms.ast -o voting.rs
```

The output Rust code is as shown below:

```
pub fn majority<A: Clone + Copy + PartialEq>(
    p: (),
    s: (),
    votes: &mut [A],
    len: usize,
) -> std::option::Option<A> {
    let mut i = 1;
    let mut k = 1;
    let votes_0 = votes[0];
    let mut cand = votes_0;
    while {
        let vi = i;
        vi < len
    } {
        let vi = i:
        let vk = k;
        let vcand = cand;
        let votes_i = votes[vi];
        if vk == 0 {
            cand = votes_i;
            k = 1;
            i = vi + 1
        } else if votes_i == vcand {
            k = vk + 1;
            i = vi + 1
        } else {
            k = vk - 1;
            i = vi + 1
```

```
};
    }
    let vk = k;
    let vcand = cand;
    let _bind_c = if vk == 0 {
        None
    } else if len < 2 * vk {</pre>
        Some(vcand)
    } else {
        i = 0;
        k = 0;
        while {
            let vi = i;
            vi < len
        } {
            let vi = i;
            let vk1 = k;
            let votes_i = votes[vi];
            if votes_i == vcand {
                k = vk1 + 1;
                 i = vi + 1
            } else {
                 i = vi + 1
            };
        let vk1 = k;
        if len < 2 * vk1 {
            Some(vcand)
        } else {
            None
        }
    };
    let cand1 = _bind_c;
    let k1 = cand1;
    let i1 = k1;
    i1
}
```

We can test it by adding the following in voting.rs and running the tests (using cargo test, it requires a Cargo. toml file, we provide an example file in the repo that can be used):

```
#[derive(Copy, Clone, PartialEq, Debug)]
enum Candidate {
    A,
    B,
    C,
}

#[test]
fn test() {
    let mut votes = [0, 1, 0, 0, 0, 1];
    let winner = majority((), (), &mut votes, 6);

(continues on next page)
```

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```
assert_eq!(winner, Some(0));

let mut str_votes = ["a", "b", "a", "a", "c"];
let str_winner = majority((), (), &mut str_votes, 5);
assert_eq!(str_winner, Some("a"));

let mut cand_votes = [Candidate::A, Candidate::B, Candidate::C, Candidate::B];
let cand_winner = majority((), (), &mut cand_votes, 4);
assert_eq!(cand_winner, None);
}
```

A few notes about the extracted Rust code:

- The Pulse function and the Rust function are generic in the type of the votes. In Rust, the extracted code required the type argument to implement the Clone, Copy, and PartialEq traits. Currently we hardcode these traits. We plan to specify these traits in Pulse through attribute mechanism
- The ghost arguments p and s appear in the Rust code as unit arguments, we plan to make it so that these arguments are completely erased.
- Whereas majority needs only read permission for the votes array in the Pulse signature, the extracted Rust code specifies the argument as &mut. The Rust extraction pipeline currently passes all the references as mut, we plan to make it more precise by taking into account the permissions from the Pulse signature.

# 45.3 C extraction

Pulse programs can also be extracted to C. The extraction pipeline is based on the Karamel tool. The process to extract Pulse programs to C is similar to that of extracting Low\* to C, described in this tutorial. In summary, we first generate .krml files from using the F\* extraction command line option --codegen krml, and then run the Karamel tool on those files.

One catch with extracting our Boyer-Moore implementation to C is that due to the lack of support of polymorphism in C, Karamel monomorphizes polymorphic functions based on their uses. So, we write a monomorphic version of the majority function for u32, that internally calls the polymorphic majority function:

Then we extract it to C as follows (the commands are run in the pulse root directory as before):

```
$ fstar.exe --include lib/pulse/ --include lib/pulse/lib
--include share/pulse/examples/by-example/ --include share/pulse/examples/_output/
→cache/
--load_cmxs pulse --odir . PulseTutorial.Algorithms.fst
--extract 'FStar.Pervasives.Native PulseTutorial.Algorithms' --codegen krml

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```

```
$ ../karamel/krml -skip-compilation out.krml
```

This produces PulseTutorial\_Algorithms.h and PulseTutorial\_Algorithms.c files, with the following implementation of majority:

```
FStar_Pervasives_Native_option__uint32_t
PulseTutorial_Algorithms_majority__uint32_t(uint32_t *votes, size_t len)
{
  size_t i = (size_t)1U;
  size_t k = (size_t)1U;
  uint32_t votes_0 = votes[0U];
 uint32_t cand = votes_0;
  size_t vi0 = i;
  bool cond = vi0 < len;</pre>
  while (cond)
  {
    size_t vi = i;
    size_t vk = k;
    uint32_t vcand = cand;
    uint32_t votes_i = votes[vi];
    if (vk == (size_t)0U)
      cand = votes_i;
     k = (size_t)1U;
      i = vi + (size_t)1U;
    else if (votes_i == vcand)
      k = vk + (size_t)1U;
      i = vi + (size_t)1U;
    }
    else
      k = vk - (size_t)1U;
      i = vi + (size_t)1U;
    size_t vi0 = i;
    cond = vi0 < len;</pre>
  size_t vk = k;
  uint32_t vcand = cand;
  if (vk == (size_t)0U)
    return ((FStar_Pervasives_Native_option__uint32_t){    .tag = FStar_Pervasives_Native_
→None });
  else if (len < (size_t)2U * vk)</pre>
    return
      (
        (FStar_Pervasives_Native_option__uint32_t){
          .tag = FStar_Pervasives_Native_Some,
          .v = vcand
        }
```

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```
);
  else
   i = (size_t)0U;
    k = (size_t)0U;
    size_t vi0 = i;
    bool cond = vi0 < len;</pre>
    while (cond)
      size_t vi = i;
      size_t vk1 = k;
      uint32_t votes_i = votes[vi];
      if (votes_i == vcand)
        k = vk1 + (size_t)1U;
        i = vi + (size_t)1U;
      else
        i = vi + (size_t)1U;
      size_t vi0 = i;
      cond = vi0 < len;</pre>
    size_t vk1 = k;
    if (len < (size_t)2U * vk1)
      return
        (
          (FStar_Pervasives_Native_option__uint32_t){
            .tag = FStar_Pervasives_Native_Some,
            .v = vcand
        );
    else
      return ((FStar_Pervasives_Native_option__uint32_t){    .tag = FStar_Pervasives_Native_
→None });
 }
}
```

We can now test it with a client like:

```
#include "PulseTutorial_Algorithms.h"

int main(int argc, char **argv) {
    uint32_t votes[4] = {1, 1, 0, 1};
    FStar_Pervasives_Native_option__uint32_t result = PulseTutorial_Algorithms_majority__
    uint32_t(votes, 4);
    if (result.tag == FStar_Pervasives_Native_None) {
        printf("No majority\n");
    } else {
        printf("Majority: %d\n", result.v);
    }
    return 0;
}
```

```
$ gcc PulseTutorial_Algorithms.c PulseTutorial_Algorithms_Client.c -I ../karamel/include/
   -I ../karamel/krmllib/c -I ../karamel/krmllib/dist/minimal/
$ ./a.out
Majority: 1
```

# 45.4 OCaml extraction

As with all F\* programs, Pulse programs can be extracted to OCaml. One caveat with using the OCaml backend for Pulse programs is that the explicit memory management from Pulse programs does not carry over to OCaml. For example, the extracted OCaml programs rely on the OCaml garbage collector for reclaiming unused heap memory, let mut variables are allocated on the heap, etc.

For the Boyer-Moore example, we can extract the program to OCaml as follows:

```
$ fstar.exe --include lib/pulse/ --include lib/pulse/lib
   --include share/pulse/examples/by-example/ --include share/pulse/examples/_output/
   --cache/
   --load_cmxs pulse --odir . PulseTutorial.Algorithms.fst
   --extract 'PulseTutorial.Algorithms' --codegen OCaml
```

and the extracted majority function looks like:

```
let majority p s votes len =
  let i = Pulse_Lib_Reference.alloc (FStar_SizeT.uint_to_t Prims.int_one) in
  let k = Pulse_Lib_Reference.alloc (FStar_SizeT.uint_to_t Prims.int_one) in
  let votes_0 =
    Pulse_Lib_Array_Core.op_Array_Access votes Stdint.Uint64.zero () () in
  let cand = Pulse_Lib_Reference.alloc votes_0 in
 let uu___ =
   Pulse_Lib_Core.while_
      (fun _ ->
         let vi = Pulse_Lib_Reference.op_Bang i () () in
         FStar_SizeT.lt vi len)
      (fun _ ->
         let vi = Pulse_Lib_Reference.op_Bang i () () in
         let vk = Pulse_Lib_Reference.op_Bang k () () in
         let vcand = Pulse_Lib_Reference.op_Bang cand () () in
         let votes_i = Pulse_Lib_Array_Core.op_Array_Access votes vi () () in
         let uu_{--} = () in
         let _bind_c =
           if vk = Stdint.Uint64.zero
             let uu___1 = Pulse_Lib_Reference.op_Colon_Equals cand votes_i () in
             let uu___2 =
               Pulse_Lib_Reference.op_Colon_Equals k Stdint.Uint64.one () in
             Pulse_Lib_Reference.op_Colon_Equals i
               (FStar_SizeT.add vi Stdint.Uint64.one) ()
           else
```

```
if votes_i = vcand
           then
             (let uu___1 =
                Pulse_Lib_Reference.op_Colon_Equals k
                  (FStar_SizeT.add vk Stdint.Uint64.one) () in
              Pulse_Lib_Reference.op_Colon_Equals i
                (FStar_SizeT.add vi Stdint.Uint64.one) ())
           else
             (let uu_1 =
                Pulse_Lib_Reference.op_Colon_Equals k
                  (FStar_SizeT.sub vk Stdint.Uint64.one) () in
              Pulse_Lib_Reference.op_Colon_Equals i
                (FStar_SizeT.add vi Stdint.Uint64.one) ()) in
       let _while_b = () in ()) in
let vk = Pulse_Lib_Reference.op_Bang k () () in
let vcand = Pulse_Lib_Reference.op_Bang cand () () in
let _bind_c =
  if vk = Stdint.Uint64.zero
 then FStar_Pervasives_Native.None
    if FStar_SizeT.lt len (FStar_SizeT.mul (Stdint.Uint64.of_int (2)) vk)
    then FStar Pervasives Native.Some vcand
    else
      (let uu_1 =
         Pulse_Lib_Reference.op_Colon_Equals i Stdint.Uint64.zero () in
      let uu___2 =
         Pulse_Lib_Reference.op_Colon_Equals k Stdint.Uint64.zero () in
       let uu___3 =
         Pulse_Lib_Core.while_
           (fun _ ->
              let vi = Pulse_Lib_Reference.op_Bang i () () in
              FStar_SizeT.lt vi len)
           (fun _ ->
              let vi = Pulse_Lib_Reference.op_Bang i () () in
              let vk1 = Pulse_Lib_Reference.op_Bang k () () in
              let votes_i =
                Pulse_Lib_Array_Core.op_Array_Access votes vi () () in
              let uu_3 = () in
              let bind c =
                if votes_i = vcand
                then
                  let uu___4 =
                    Pulse_Lib_Reference.op_Colon_Equals k
                      (FStar_SizeT.add vk1 Stdint.Uint64.one) () in
                  Pulse_Lib_Reference.op_Colon_Equals i
                    (FStar_SizeT.add vi Stdint.Uint64.one) ()
                else
                  Pulse_Lib_Reference.op_Colon_Equals i
                    (FStar_SizeT.add vi Stdint.Uint64.one) () in
              let _while_b = () in ()) in
       let vk1 = Pulse_Lib_Reference.op_Bang k () () in
       if
```

```
FStar_SizeT.lt len
     (FStar_SizeT.mul (Stdint.Uint64.of_int (2)) vk1)
    then FStar_Pervasives_Native.Some vcand
    else FStar_Pervasives_Native.None) in
let cand1 = _bind_c in let k1 = cand1 in let i1 = k1 in i1
```

# Part VIII Under the hood

In this part of the book, we'll look at some of the inner workings of  $F^*$ , things that you will eventually need to know to become an expert user of the system. We'll cover  $F^*$ 's SMT encoding, its two normalization engines, its plugin framework, and other topics.

Proof-Oriented Programming in F*	

## **UNDERSTANDING HOW F\* USES Z3**

As we have seen throughout, F\* relies heavily on the Z3 SMT (Satisfiability Modulo Theories) solver for proof automation. Often, on standalone examples at the scale covered in earlier chapters, the automation just works out of the box, but as one builds larger developments, proof automation can start becoming slower or unpredictable—at that stage, it becomes important to understand how F\*'s encoding to SMT works to better control proofs.

At the most abstract level, one should realize that finding proofs in the SMT logic F\* uses (first-order logic with uninterpreted functions and arithmetic) is an undecidable problem. As such, F\* and the SMT solver relies on various heuristics and partial decision procedures, and a solver like Z3 does a remarkable job of being able to effectively solve the very large problems that F\* presents to it, despite the theoretical undecidability. That said, the proof search that Z3 uses is computationally expensive and can be quite sensitive to the choice of heuristics and syntactic details of problem instances. As such, if one doesn't chose the heuristics well, a small change in a query presented to Z3 can cause it to take a different search path, perhaps causing a proof to not be found at all, or to be found after consuming a very different amount of resources.

Some background and resources:

- F\*'s SMT encoding uses the SMT-LIB v2 language. We refer to the "SMT-LIB v2" language as SMT2.
- Alejandro Aguirre wrote a tech report describing work in progress towards formalizing F\*'s SMT encoding.
- Michal Moskal's Programming with Triggers describes how to pick triggers for quantifier instantiation and how
  to debug and profile the SMT solver, in the context of Vcc and the relation Hypervisor Verification project.
- Leonardo de Moura and Nikolaj Bjorner describe how E-matching is implemented in Z3 (at least circa 2007).

#### 46.1 A Primer on SMT2

SMT2 is a standardized input language supported by many SMT solvers. Its syntax is based on S-expressions, inspired by languages in the LISP family. We review some basic elements of its syntax here, particularly the parts that are used by F\*'s SMT encoding.

· Multi-sorted logic

The logic provided by the SMT solver is multi-sorted: the sorts provide a simple type system for the logic, ensuring, e.g., that terms from two different sorts can never be equal. A user can define a new sort T, as shown below:

#### (declare-sort T)

Every sort comes with a built-in notion of equality. Given two terms p and q of the same sort T, (=pq) is a term of sort Bool expressing their equality.

• Declaring uninterpreted functions

A new function symbol F, with arguments in sorts sort\_1 .. sort\_n and returning a result in sort is declared as shown below.

```
(declare-fun F (sort_1 ... sort_n) sort)
```

The function symbol F is *uninterpreted*, meaning that the only information the solver has about F is that it is a function, i.e., when applied to equal arguments F produces equal results.

· Theory symbols

Z3 provides support for several *theories*, notably integer and real arithmetic. For example, on terms i and j of Int sort, the sort of unbounded integers, the following terms define the expected arithmetic functions:

```
(+ i j) ; addition
(- i j) ; subtraction
(* i j) ; multiplication
(div i j) ; Euclidean division
(mod i j) ; Euclidean modulus
```

Logical connectives

SMT2 provides basic logical connectives as shown below, where p and q are terms of sort Bool

```
(and p q); conjunction(or p q); disjunction(not p); negation(implies p q); implication(iff p q); bi-implication
```

SMT2 also provides support for quantifiers, where the terms below represent a term p with the variables x1 ... xn universally and existentially quantified, respectively.

```
(forall ((x1 sort_1) ... (xn sort_n)) p)
(exists ((x1 sort_1) ... (xn sort_n)) p)
```

• Attribute annotations

A term p can be decorated with attributes names  $a_1 \dots a_n$  with values  $v_1 \dots v_n$  using the following syntax—the ! is NOT to be confused with logical negation.

```
(! p
:a_1 v_1
...
:a_n v_n)
```

A common usage is with quantifiers, as we'll see below, e.g.,

• An SMT2 theory and check-sat

An SMT2 theory is a collection of sort and function symbol declarations, and assertions of facts about them. For example, here's a simple theory declaring a function symbol f and an assumption that f x y is equivalent to (>= x y)—note, unlike in F\*, the assert keyword in SMT2 assumes that a fact is true, rather than checking that it is valid, i.e., assert in SMT2 is like assume in F\*.

In the context of this theory, one can ask whether some facts about f are valid. For example, to check if f is a transitive function, one asserts the *negation* of the transitivity property for f and then asks Z3 to check (using the (check-sat) directive) if the resulting theory is satisfiable.

In this case, Z3 very quickly responds with unsat, meaning that there are no models for the theory that contain an interpretation of f compatible with both assertions, or, equivalently, the transitivity of f is true in all models. That is, we expect successful queries to return unsat.

# 46.2 A Brief Tour of F\*'s SMT Encoding

Consider the following simple F\* code:

```
let id x = x
let f (x:int) =
   if x < 0
   then assert (- (id x) >= 0)
   else assert (id x >= 0)
```

To encode the proof obligation of this program to SMT, F\* generates an SMT2 file with the following rough shape.

```
;; Followed by some instrumentation for error reporting
;; in case the check-sat call fails (i.e., does not return unsat)
```

That was just just to give you a rough idea—the details of F\*'s actual SMT encoding are a bit different, as we'll see below.

To inspect  $F^*$ 's SMT encoding, we'll work through several small examples and get  $F^*$  to log the SMT2 theories that it generates. For this, we'll use the file shown below as a skeleton, starting with the #push-options "--log\_queries" directive, which instructs  $F^*$  to print out its encoding to .smt2 file. The force\_a\_query definition at the end ensures that  $F^*$  actually produces at least one query—without it,  $F^*$  sends nothing to the Z3 and so prints no output in the .smt2 file. If you run fstar.exe SMTEncoding.fst on the command line, you will find a file queries-SMTEncoding. smt2 in the current directory.

```
module SMTEncoding
open FStar.Mul
#push-options "--log_queries"
let false_boolean = false
let true_boolean = true

let rec factorial (n:nat) : nat =
   if n = 0 then 1
   else n * factorial (n - 1)

let id (x:Type0) = x
let force_a_query = assert (id True)
```

Even for a tiny module like this, you'll see that the .smt2 file is very large. That's because, by default, F\* always includes the modules prims.fst, FStar.Pervasives.Native.fst, and FStar.Pervasives.fsti as dependences of other modules. Encoding these modules consumes about 150,000 lines of SMT2 definitions and comments.

The encoding of each module is delimited in the .smt2 file by comments of the following kind:

```
;;; Start module Prims
...
;;; End module Prims (1334 decls; total size 431263)

;;; Start module FStar.Pervasives.Native
...
;;; End module FStar.Pervasives.Native (2643 decls; total size 2546449)

;;; Start interface FStar.Pervasives
...
;;; End interface FStar.Pervasives (2421 decls; total size 1123058)
```

where each *End* line also describes the number of declarations in the module and its length in characters.

## 46.2.1 Term sort

Despite SMT2 being a multi-sorted logic, aside from the pervasive use the SMT sort Bool,  $F^*$ 's encoding to SMT (mostly) uses just a single sort: every pure (or ghost)  $F^*$  term is encoded to the SMT solver as an instance of an uninterpreted SMT sort called Term. This allows the encoding to be very general, handling  $F^*$ 's much richer type system, rather than trying to map  $F^*$ 's complex type system into the much simpler type system of SMT sorts.

#### 46.2.2 Booleans

One of the most primitive sorts in the SMT solver is Bool, the sort of Booleans. All the logical connectives in SMT are operations on the Bool sort. To encode values of the F\* type bool to SMT, we use the Bool sort, but since all F\* terms are encoded to the Term sort, we "box" the Bool sort to promote it to Term, using the SMT2 definitions below.

This declares two uninterpreted functions BoxBool and BoxBool\_proj\_0 that go back and forth between the sorts Bool and Term.

The axiom named projection\_inverse\_BoxBool\_proj\_0 states that BoxBool\_proj\_0 is the inverse of BoxBool, or, equivalently, that BoxBool is an injective function from Bool to Term.

The qid is the quantifier identifier, usually equal to or derived from the name of the assumption that includes it—qids come up when we look at *profiling quantifier instantiation*.

## 46.2.3 Patterns for quantifier instantiation

The projection\_inverse\_BoxBool\_proj\_0 axiom on booleans shows our first use of a quantified formula with a pattern, i.e., the part that says :pattern ((BoxBool @u0)). These patterns are the main heuristic used to control the SMT solver's proof search and will feature repeatedly in the remainder of this chapter.

When exploring a theory, the SMT solver has a current partial model which contains an assignment for some of the variables in a theory to ground terms. All the terms that appear in this partial model are called *active* terms and these active terms play a role in quantifier instantiation.

Each universally quantified formula in scope is a term of the form below:

```
(forall ((x1 s1) ... (xn sn))
(! ( body )
:pattern ((p1) ... (pm))))
```

This quantified formula is inert and only plays a role in the solver's search once the bound variables  $x1 \dots xn$  are instantiated. The terms  $p1 \dots pm$  are called patterns, and collectively,  $p1 \dots pm$  must mention *all* the bound variables. To instantiate the quantifier, the solver aims to find active terms  $v1 \dots vm$  that match the patterns  $p1 \dots pm$ , where a match involves finding a substitution S for the bound variables  $x1 \dots xm$ , such that the substituted patterns  $S(p1 \dots pm)$  are equal to the active terms  $v1 \dots vm$ . Given such a substitution, the substituted term S(body) becomes active and may refine the partial model further.

Existentially quantified formulas are dual to universally quantified formulas. Whereas a universal formula in the *context* (i.e., in negative position, or as a hypothesis) is inert until its pattern is instantiated, an existential *goal* (or, in positive position) is inert until its pattern is instantiated. Existential quantifiers can be decorated with patterns that trigger instantiation when matched with active terms, just like universal quantifiers

Returning to projection\_inverse\_BoxBool\_proj\_0, what this means is that once the solver has an active term BoxBool b, it can instantiate the quantified formula to obtain (= (BoxBool\_proj\_0 (BoxBool b)) b).

# 46.2.4 Integers

The encoding of the  $F^*$  type int is similar to that of bool—the primitive SMT sort Int (of unbounded mathematical integers) are coerced to Term using the injective function BoxInt.

The primitive operations on integers are encoded by unboxing the arguments and boxing the result. For example, here's the encoding of Prims. (+), the addition operator on integers.

This declares an uninterpreted function Prims.op\_Addition, a binary function on Term, and an assumption relating it to the SMT primitive operator from the integer arithmetic theory (+). The pattern allows the SMT solver to instantiate this quantifier for every active application of the Prims.op\_Addition.

The additional boxing introduces some overhead, e.g., proving x + y == y + x in  $F^*$  amounts to proving Prims. op\_Addition  $x y == Prims.op_Addition y x in SMT2$ . This in turn involves instantiation quantifiers, then reasoning in the theory of linear arithmetic, and finally using the injectivity of the BoxInt function to conclude. However, this overhead is usually not perceptible, and the uniformity of encoding everything to a single Term sort simplifies many other things. Nevertheless,  $F^*$  provides a few options to control the way integers and boxed and unboxed, described ahead.

## 46.2.5 Functions

Consider the F\* function below:

Its encoding to SMT has several elements.

First, we have have a declaration of an uninterpreted ternary function on Term.

```
(declare-fun SMTEncoding.add3 (Term Term Term) Term)
```

The semantics of add3 is given using the assumption below, which because of the pattern on the quantifier, can be interpreted as a rewrite rule from left to right: every time the solver has  $SMTEncoding.add3 \times y \times z$  as an active term, it can expand it to its definition.

In addition to its definition, F\* encodes *the type of* add3 to the solver too, as seen by the assumption below. One of the key predicates of F\*'s SMT encoding is HasType, which relates a term to its type. The assumption typing\_SMTEncoding.add3 encodes the typing of the application based on the typing hypotheses on the arguments.

This is all we'd need to encode add3 if it was never used at higher order. However, F\* treats functions values just like any other value and allows them to be passed as arguments to, or returned as results from, other functions. The SMT logic is, however, a first-order logic and functions like add3 are not first-class values. So, F\* introduces another layer in the encoding to model higher-order functions, but we don't cover this here.

### 46.2.6 Recursive functions and fuel

Non-recursive functions are similar to macro definitions—F\* just encodes encodes their semantics to the SMT solver as a rewrite rule. However, recursive functions, since they could be unfolded indefinitely, are not so simple. Let's look at the encoding of the factorial function shown below.

```
open FStar.Mul
let rec factorial (n:nat) : nat =
  if n = 0 then 1
  else n * factorial (n - 1)
```

First, we have, as before, an uninterpreted function symbol on Term and an assumption about its typing.

However, to define the semantics of factorial we introduce a second "fuel-instrumented" function symbol with an additional parameter of Fuel sort.

```
(declare-fun SMTEncoding.factorial.fuel_instrumented (Fuel Term) Term)
```

The Fuel sort is declared at the very beginning of F\*'s SMT encoding and is a representation of unary integers, with two constructors ZFuel (for zero) and SFuel f (for successor).

The main idea is to encode the definition of factorial guarded by patterns that only allow unfolding the definition if the fuel argument of factorial.fuel\_instrumented is not zero, as shown below. Further, the assumption defining the semantics of factorial.fuel\_instrumented is guarded by a typing hypothesis on the argument (HasType @x1 Prims.nat), since the recursive function in F\* is only well-founded on nat, not on all terms. The :weight annotation is an SMT2 detail: setting it to zero ensures that the SMT solver can instantiate this quantifier as often as needed, so long as the the fuel instrumentation argument is non-zero. Notice that the equation peels off one application of SFuel, so that the quantifier cannot be repeatedly instantiated infinitely.

```
      (assert (! (forall ((@u0 Fuel) (@x1 Term))
      (! (implies (HasType @x1 Prims.nat)

      (= (SMTEncoding.factorial.fuel_instrumented (SFuel @u0)__

      →@x1)
      (let ((@lb2 (Prims.op_Equality Prims.int @x1 (BoxInt__

      →0))))
      (ite (= @lb2 (BoxBool true))

      (BoxInt 1)
      (Prims.op_Multiply

      @x1
      (SMTEncoding.factorial.fuel_

      →instrumented
      @u0

      (Prims.op_Subtraction @x1_

      →(BoxInt 1)))))))
      :weight 0
```

We also need an assumption that tells the SMT solver that the fuel argument, aside from controlling the number of unfoldings, is semantically irrelevant.

And, finally, we relate the original function to its fuel-instrumented counterpart.

This definition uses the constant MaxFuel. The value of this constant is determined by the F\* options --initial\_fuel n and --max\_fuel m. When F\* issues a query to Z3, it tries the query repeatedly with different values of MaxFuel ranging between n and m. Additionally, the option --fuel n sets both the initial fuel and max fuel to n.

This single value of MaxFuel controls the number of unfoldings of *all* recursive functions in scope. Of course, the patterns are arranged so that if you have a query involving, say, List.map, quantified assumptions about an unrelated recursive function like factorial should never trigger. Neverthless, large values of MaxFuel greatly increase the search space for the SMT solver. If your proof requires a setting greater than --fuel 2, and if it takes the SMT solver a long time to find the proof, then you should think about whether things could be done differently.

However, with a low value of fuel, the SMT solver cannot reason about recursive functions beyond that bound. For instance, the following fails, since the solver can unroll the definition only once to conclude that factorial 1 == 1 \* factorial 0, but being unable to unfold factorial 0 further, the proof fails.

```
#push-options "--fuel 1"
let _ = assert (factorial 1 == 1) (* fails *)
```

As with regular functions, the rest of the encoding of recursive functions has to do with handling higher-order uses.

# 46.2.7 Inductive datatypes and ifuel

Inductive datatypes in  $F^*$  allow defining unbounded structures and, just like with recursive functions,  $F^*$  encodes them to SMT by instrumenting them with fuel, to prevent infinite unfoldings. Let's look at a very simple example, an  $F^*$  type of unary natural numbers.

```
type unat =
    | Z : unat
    | S : (prec:unat) -> unat
```

Although Z3 offers support for a built-in theory of datatypes, F\* does not use it (aside for Fue1), since F\* datatypes are more complex. Instead, F\* rolls its own datatype encoding using uninterpreted functions and the encoding of unat begins by declaring these functions.

```
(declare-fun SMTEncoding.unat () Term)
(declare-fun SMTEncoding.Z () Term)
(declare-fun SMTEncoding.S (Term) Term)
(declare-fun SMTEncoding.S_prec (Term) Term)
```

We have one function for the type unat; one for each constructor (Z and S); and one "projector" for each argument of each constructor (here, only S\_prec, corresponding to the F\* projector S?.prec).

The type unat has its typing assumption, where Tm\_type is the SMT encoding of the F\* type Type—note F\* does not encode the universe levels to SMT.

```
(assert (! (HasType SMTEncoding.unat Tm_type)
    :named kinding_SMTEncoding.unat@tok))
```

The constructor S\_prec is assumed to be an inverse of S. If there were more than one argument to the constructor, each projector would project out only the corresponding argument, encoding that the constructor is injective on each of its arguments.

The encoding defines two macros is-SMTEncoding. Z and is-SMTEncoding. S that define when the head-constructor of a term is Z and S respectively. These two macros are used in the definition of the inversion assumption of datatypes, namely that given a term of type unat, one can conclude that its head constructor must be either Z or S. However, since the type unat is unbounded, we want to avoid applying this inversion indefinitely, so it uses a quantifier with a pattern that requires non-zero fuel to be triggered.

Here, we see a use of HasTypeFuel, a fuel-instrumented version of the HasType we've seen earlier. In fact, (HasType x t) is just a macro for (HasTypeFuel MaxIFuel x t), where much like for recursive functions and fuel, the constant MaxIFuel is defined by the current value of the  $F^*$  options --initial\_ifuel, --max\_ifuel, and --ifuel (where ifuel stands for "inversion fuel").

The key bit in ensuring that the inversion assumption above is not indefinitely applied is in the structure of the typing assumptions for the data constructors. These typing assumptions come in two forms, introduction and elimination.

The introduction form for the S constructor is shown below. This allows deriving that S x has type unat from the fact that x itself has type unat. The pattern on the quantifier makes this goal-directed: if (HasTypeFuel @u0 (SMTEncoding.S @x1) SMTEncoding.unat) is already an active term, then the quantifier fires to make (HasTypeFuel @u0 @x1 SMTEncoding.unat) an active term, peeling off one application of the S constructor. If we were to use (HasTypeFuel @u0 @x1 SMTEncoding.unat) as the pattern, this would lead to an infinite quantifier instantiation loop, since every each instantiation would lead a new, larger active term that could instantiate the quantifier

again. Note, using the introduction form does not vary the fuel parameter, since the number of applications of the constructor S decreases at each instantiation anyway.

The elimination form allows concluding that the sub-terms of a well-typed application of a constructor are well-typed too. This time note that the conclusion of the rule decreases the fuel parameter by one. If that were not the case, then we would get a quantifier matching loop between data\_elim\_SMTEncoding.S and fuel\_guarded\_inversion\_SMTEncoding.unat, since each application of the latter would contribute an active term of the form (HasTypeFuel (SFuel \_) (S (S\_prec x)) unat), allowing the former to be triggered again.

A final important element in the encoding of datatypes has to do with the well-founded ordering used in termination proofs. The following states that if S x1 is well-typed (with non-zero fuel) then x1 precedes S x1 in F\*'s built-in sub-term ordering.

Once again, a lot of the rest of the datatype encoding has to do with handling higher order uses of the constructors.

As with recursive functions, the single value of MaxIFuel controls the number of inversions of all datatypes in scope. It's a good idea to try to use an ifuel setting that is as low as possible for your proofs, e.g., a value less than 2, or even 0, if possible. However, as with fuel, a value of ifuel that is too low will cause the solver to be unable to prove some facts. For example, without any ifuel, the solver cannot use the inversion assumption to prove that the head of x must be either S or Z, and F\* reports the error "Patterns are incomplete".

```
#push-options "--ifuel 0"
let rec as_nat (x:unat) : nat =
    match x with (* fails exhaustiveness check *)
    | S x -> 1 + as_nat x (* fails termination check *)
    | Z -> 0
```

Sometimes it is useful to let the solver arbitrarily invert an inductive type. The FStar.Pervasives.

allow\_inversion is a library function that enables this, as shown below. Within that scope, the ifuel guards on the unat type are no longer imposed and SMT can invert unat freely—F\* accepts the code below.

```
#push-options "--ifuel 0"
let rec as_nat (x:unat) : nat =
  allow_inversion unat;
  match x with
  | S x -> 1 + as_nat x
  | Z -> 0
```

This can be useful sometimes, e.g., one could set the ifuel to 0 and allow inversion within a scope for only a few selected types, e.g., option. However, it is rarely a good idea to use allow\_inversion on an unbounded type (e.g., list or even unat).

# 46.2.8 Logical Connectives

The *logical connectives* that F\* offers are all derived forms. Given the encodings of datatypes and functions (and arrow types, which we haven't shown), the encodings of all these connectives just fall out naturally. However, all these connectives also have built-in support in the SMT solver as part of its propositional core and support for E-matching-based quantifier instantiation. So, rather than leave them as derived forms, a vital optimization in F\*'s SMT encoding is to recognize these connectives and to encode them directly to the corresponding forms in SMT.

The term p / q in  $F^*$  is encoded to (and [[p]] [[q]]]) where [[p]] and [[q]] are the *logical* encodings of p and q respectively. However, the SMT connective and is a binary function on the SMT sort Bool, whereas all we have been describing so far is that every  $F^*$  term p is encoded to the SMT sort Term. To bridge the gap, the logical encoding of a term p interprets the Term sort into Bool by using a function Valid p, which deems a p: Term to be valid if it is inhabited, as per the definitions below.

The connectives  $p \setminus q$ , p ==> q, p <==> q, and  $\sim p$  are similar.

The quantified forms for all and exists are mapped to the corresponding quantifiers in SMT. For example,

```
let fact_positive = forall (x:nat). factorial x >= 1
```

is encoded to:

Note, this quantifier does not have any explicitly annotated patterns. In this case, Z3's syntactic trigger selection heuristics pick a pattern: it is usually the smallest collection of sub-terms of the body of the quantifier that collectively mention all the bound variables. In this case, the choices for the pattern are (SMTEncoding.factorial @x1) and (HasType @x1 Prims.nat): Z3 picks both of these as patterns, allowing the quantifier to be triggered if an active term matches either one of them.

For small developments, leaving the choice of pattern to Z3 is often fine, but as your project scales up, you probably want to be more careful about your choice of patterns.  $F^*$  lets you write the pattern explicitly on a quantifier and translates it down to SMT, as shown below.

```
let fact_positive_2 = forall (x:nat).{:pattern (factorial x)} factorial x >= 1
```

This produces:

Note, since factorial is fuel instrumented, the pattern is translated to an application that requires no fuel, so that the property also applies to any partial unrolling of factorial also.

Existential formulas are similar. For example, one can write:

```
let fact_unbounded = forall (n:nat). exists (x:nat). factorial x >= n
```

And it gets translated to:

# 46.2.9 Options for Z3 and the SMT Encoding

F\* provides two ways of passing options to Z3.

The option  $--z3cliopt < string > causes F* to pass the string as a command-line option when starting the Z3 process. A typical usage might be <math>--z3cliopt 'smt.random_seed=17'$ .

In contrast, --z3smtopt <string> causes F\* to send the string to Z3 as part of its SMT2 output and this option is also reflected in the .smt2 file that F\* emits with  $--log\_queries$ . As such, it can be more convenient to use this option if you want to debug or profile a run of Z3 on an .smt2 file generated by F\*. A typical usage would be --z3smtopt '(set-option :smt.random\_seed 17)'. Note, it is possible to abuse this option, e.g., one could use --z3smtopt '(assert false)' and all SMT queries would trivially pass. So, use it with care.

F\*'s SMT encoding also offers a few options.

• --smtencoding.l\_arith\_repr native

This option requests  $F^*$  to inline the definitions of the linear arithmetic operators (+ and -). For example, with this option enabled,  $F^*$  encodes the term x + 1 + 2 as the SMT2 term below.

• --smtencoding.elim\_box true

This option is often useful in combination with smtencoding.l\_arith\_repr native, enables an optimization to remove redundant adjacent box/unbox pairs. So, adding this option to the example above, the encoding of x + 1 + 2 becomes:

```
(BoxInt (+ (+ (BoxInt_proj_0 @x0) 1) 2))
```

• --smtencoding.nl\_arith\_repr [native|wrapped|boxwrap]

This option controls the representation of non-linear arithmetic functions (\*, /, mod) in the SMT encoding. The default is boxwrap which uses the encoding of Prims.op\_Multiply, Prims.op\_Division, Prims.op\_Modulus analogous to Prims.op\_Addition.

The native setting is similar to the smtencoding.l\_arith\_repr native. When used in conjuction with smtencoding.elim\_box true, the  $F^*$  term x \* 1 \* 2 is encoded to:

```
(BoxInt (* (* (BoxInt_proj_0 @x0) 1) 2))
```

However, a third setting wrapped is also available with provides an intermediate level of wrapping. With this setting enabled, the encoding of  $\mathbf{x} + \mathbf{1} + \mathbf{2}$  becomes

```
(BoxInt (_mul (_mul (BoxInt_proj_0 @x0) 1) 2))
```

where \_mul is declared as shown below:

```
      (declare-fun _mul (Int Int) Int)

      (assert (forall ((x Int) (y Int)) (! (= (_mul x y) (* x y)) :pattern ((_mul x y)))))
```

Now, you may wonder why all these settings are useful. Surely, one would think, --smtencoding.l\_arith\_repr native --smtencoding.nl\_arith\_repr native --smtencoding.elim\_box true is the best setting. However, it turns out that the additional layers of wrapping and boxing actually enable some proofs to go through, and, empirically, no setting strictly dominates all the others.

However, the following is a good rule of thumb if you are starting a new project:

- 1. Consider using --z3smtopt '(set-option :smt.arith.nl false)'. This entirely disables support for non-linear arithmetic theory reasoning in the SMT solver, since this can be very expensive and unpredictable. Instead, if you need to reason about non-linear arithmetic, consider using the lemmas from FStar.Math.Lemmas to do the non-linear steps in your proof manually. This will be more painstaking, but will lead to more stable proofs.
- 2. For linear arithmetic, the setting --smtencoding.l\_arith\_repr native --smtencoding.elim\_box true is a good one to consider, and may yield some proof performance boosts over the default setting.

# 46.3 Designing a Library with SMT Patterns

In this section, we look at the design of FStar.Set, a module in the standard library, examining, in particular, its use of SMT patterns on lemmas for proof automation. The style used here is representative of the style used in many proof-oriented libraries—the interface of the module offers an abstract type, with some constructors and some destructors, and lemmas that relate their behavior.

To start with, for our interface, we set the fuel and ifuel both to zero—we will not need to reason about recursive functions or invert inductive types here.

```
module SimplifiedFStarSet
  (** Computational sets (on eqtypes): membership is a boolean function *)
#set-options "--fuel 0 --ifuel 0"
```

Next, we introduce the signature of the main abstract type of this module, set:

```
val set (a:eqtype)
: Type0
```

Sets offer just a single operation called mem that allows testing whether or not a given element is in the set.

```
val mem (#a:eqtype) (x:a) (s:set a)
    : bool
```

However, there are several ways to construct sets:

```
val empty (#a:eqtype)
    : set a

val singleton (#a:eqtype) (x:a)
    : set a

val union (#a:eqtype) (s0 s1: set a)
    : set a

val intersect (#a:eqtype) (s0 s1: set a)
    : set a

val complement (#a:eqtype) (s0:set a)
    : set a
```

Finally, sets are equipped with a custom equivalence relation:

```
val equal (#a:eqtype) (s0 s1:set a)
    : prop
```

The rest of our module offers lemmas that describe the behavior of mem when applied to each of the constructors.

```
val mem_empty (#a:eqtype) (x:a)
  : Lemma
    (ensures (not (mem x empty)))
    [SMTPat (mem x empty)]
val mem_singleton (#a:eqtype) (x y:a)
  : Lemma
    (ensures (mem y (singleton x) == (x=y)))
    [SMTPat (mem y (singleton x))]
val mem_union (#a:eqtype) (x:a) (s1 s2:set a)
  : Lemma
    (ensures (mem x (union s1 s2) == (mem x s1 \mid \mid mem x s2)))
    [SMTPat (mem x (union s1 s2))]
val mem_intersect (#a:eqtype) (x:a) (s1:set a) (s2:set a)
    (ensures (mem x (intersect s1 s2) == (mem x s1 && mem x s2)))
    [SMTPat (mem x (intersect s1 s2))]
val mem_complement (#a:eqtype) (x:a) (s:set a)
```

```
: Lemma
  (ensures (mem x (complement s) == not (mem x s)))
  [SMTPat (mem x (complement s))]
```

Each of these lemmas should be intuitive and familiar. The extra bit to pay attention to is the SMTPat annotations on each of the lemmas. These annotations instruct F\*'s SMT encoding to treat the lemma like a universal quantifier guarded by the user-provided pattern. For instance, the lemma mem\_empty is encoded to the SMT solver as shown below.

That is, from the perspective of the SMT encoding, the statement of the lemma mem\_empty is analogous to the following assumption:

```
forall (a:eqtype) (x:a). {:pattern (mem x empty)} not (mem x empty)
```

As such, lemmas decorated with SMT patterns allow the user to inject new, quantified hypotheses into the solver's context, where each of those hypotheses is justified by a proof in F\* of the corresponding lemma. This allows users of the FStar. Set library to treat set almost like a new built-in type, with proof automation to reason about its operations. However, making this work well requires some careful design of the patterns.

Consider mem\_union: the pattern chosen above allows the solver to decompose an active term mem x (union s1 s2) into mem x s1 and mem x s2, where both terms are smaller than the term we started with. Suppose instead that we had written:

```
val mem_union (#a:eqtype) (x:a) (s1 s2:set a)
    : Lemma
        (ensures (mem x (union s1 s2) == (mem x s1 || mem x s2)))
        [SMTPat (mem x s1); SMTPat (mem x s2)]
```

This translates to an SMT quantifier whose patterns are the pair of terms mem  $x ext{ s1}$  and mem  $x ext{ s2}$ . This choice of pattern would allow the solver to instantiate the quantifier with all pairs of active terms of the form mem  $x ext{ s}$ , creating more active terms that are themselves matching candidates. To be explicit, with a single active term mem  $x ext{ s}$ , the solver would derive mem  $x ext{ (union } s ext{ s)}$ , mem  $x ext{ (union } s ext{ (union } s ext{ s)}$ , and so on. This is called a matching loop and can be disastrous for solver performance. So, carefully chosing the patterns on quantifiers and lemmas with SMTPat annotations is important.

Finally, to complete our interface, we provide two lemmas to characterize equal, the equivalence relation on sets. The first says that sets that agree on the mem function are equal, and the second says that equal sets are provably equal (==), and the patterns allow the solver to convert reasoning about equality into membership and provable equality.

Of course, all these lemmas can be easily proven by  $F^*$  under a suitable representation of the abstract type set, as shown in the module implementation below.

```
module SimplifiedFStarSet
(** Computational sets (on eqtypes): membership is a boolean function *)
#set-options "--fuel 0 --ifuel 0"
open FStar.FunctionalExtensionality
module F = FStar.FunctionalExtensionality
let set (a:eqtype) = F.restricted_t a (fun _ -> bool)
(* destructors *)
let mem \#a x s = s x
(* constructors *)
let empty #a = F.on_dom a (fun x -> false)
let singleton #a x = F.on_dom a (fun y -> y = x)
let union #a s1 s2 = F.on_dom a (fun x -> s1 x \mid \mid s2 x)
let intersect #a s1 s2 = F.on_dom a (fun x -> s1 x && s2 x)
let complement \#a \ s = F.on\_dom \ a \ (fun \ x \rightarrow not \ (s \ x))
(* equivalence relation *)
let equal (#a:eqtype) (s1:set a) (s2:set a) = F.feq s1 s2
(* Properties *)
let mem_empty
                               = ()
                   #a x
let mem_singleton #a x y = ()
let mem_union
                   \#a \times s1 \ s2 = ()
let mem_intersect #a x s1 s2 = ()
let mem_complement #a x s = ()
(* extensionality *)
let equal_intro #a s1 s2 = ()
let equal_elim #a s1 s2 = ()
```

#### 46.3.1 Exercise

Extend the set library with another constructor with the signature shown below:

```
val from_fun (#a:eqtype) (f: a -> bool) : Tot (set a)
```

and prove a lemma that shows that a an element x is in from\_fun f if and only if f x = true, decorating the lemma with the appropriate SMT pattern.

This interface file and its implementation provides the definitions you need.

#### Answer

Look at FStar.Set.intension if you get stuck

# 46.4 Profiling Z3 and Solving Proof Performance Issues

At some point, you will write F\* programs where proofs start to take much longer than you'd like: simple proofs fail to go through, or proofs that were once working start to fail as you make small changes to your program. Hopefully, you notice this early in your project and can try to figure out how to make it better before slogging through slow and unpredictable proofs. Contrary to the wisdom one often receives in software engineering where early optimization is discouraged, when developing proof-oriented libraries, it's wise to pay attention to proof performance issues as soon as they come up, otherwise you'll find that as you scale up further, proofs become so slow or brittle that your productivity decreases rapidly.

## 46.4.1 Query Statistics

Your first tool to start diagnosing solver performance is  $F^*$ 's --query\_stats option. We'll start with some very simple artificial examples.

With the options below, F\* outputs the following statistics:

```
#push-options "--initial_fuel 0 --max_fuel 4 --ifuel 0 --query_stats"
let _ = assert (factorial 3 == 6)
```

```
(<input>(20,0-20,49))
                            Query-stats (SMTEncoding._test_query_stats, 1) failed
  {reason-unknown=unknown because (incomplete quantifiers)} in 31 milliseconds
  with fuel 0 and ifuel 0 and rlimit 2723280
  statistics={mk-bool-var=7065 del-clause=242 num-checks=3 conflicts=5
              binary-propagations=42 arith-fixed-eqs=4 arith-pseudo-nonlinear=1
              propagations=10287 arith-assert-upper=21 arith-assert-lower=18
              decisions=11 datatype-occurs-check=2 rlimit-count=2084689
              arith-offset-eqs=2 quant-instantiations=208 mk-clause=3786
              minimized-lits=3 memory=21.41 arith-pivots=6 max-generation=5
              arith-conflicts=3 time=0.03 num-allocs=132027456 datatype-accessor-ax=3
              max-memory=21.68 final-checks=2 arith-eq-adapter=15 added-eqs=711}
(<input>(20,0-20,49))
                            Query-stats (SMTEncoding._test_query_stats, 1) failed
  {reason-unknown=unknown because (incomplete quantifiers)} in 47 milliseconds
  with fuel 2 and ifuel 0 and rlimit 2723280
  statistics={mk-bool-var=7354 del-clause=350 arith-max-min=10 interface-eqs=3
```

```
num-checks=4 conflicts=8 binary-propagations=56 arith-fixed-eqs=17
              arith-pseudo-nonlinear=3 arith-bound-prop=2 propagations=13767
               arith-assert-upper=46 arith-assert-lower=40 decisions=25
               datatype-occurs-check=5 rlimit-count=2107946 arith-offset-eqs=6
               quant-instantiations=326 mk-clause=4005 minimized-lits=4
              memory=21.51 arith-pivots=20 max-generation=5 arith-add-rows=34
               arith-conflicts=4 time=0.05 num-allocs=143036410 datatype-accessor-ax=5
              max-memory=21.78 final-checks=6 arith-eq-adapter=31 added-eqs=1053}
                            Query-stats (SMTEncoding._test_guery_stats, 1) succeeded
(<input>(20,0-20,49))
   in 48 milliseconds with fuel 4 and ifuel 0 and rlimit 2723280
   statistics={arith-max-min=26 num-checks=5 binary-propagations=70 arith-fixed-eqs=47
                arith-assert-upper=78 arith-assert-lower=71 decisions=40
                rlimit-count=2130332 max-generation=5 arith-nonlinear-bounds=2
                time=0.05 max-memory=21.78 arith-eq-adapter=53 added-eqs=1517
                mk-bool-var=7805 del-clause=805 interface-egs=3 conflicts=16
                arith-pseudo-nonlinear=6 arith-bound-prop=4 propagations=17271
                datatype-occurs-check=5 arith-offset-eqs=20 quant-instantiations=481
                mk-clause=4286 minimized-lits=38 memory=21.23 arith-pivots=65
                arith-add-rows=114 arith-conflicts=5 num-allocs=149004462
                datatype-accessor-ax=9 final-checks=7}
```

There's a lot of information here:

- We see three lines of output, each tagged with a source location and an internal query identifier ((SMTEncoding. \_test\_query\_stats, 1), the first query for verifying \_test\_query\_stats).
- The first two attempts at the query failed, with Z3 reporting the reason for failure as unknown because (incomplete quantifiers). This is a common response from Z3 when it fails to prove a query—since first-order logic is undecidable, when Z3 fails to find a proof, it reports "unknown" rather than claiming that the theory is satisfiable. The third attempt succeeded.
- The attempts used 0, 2, and 4 units of fuel. Notice that our query was factorial 3 == 6 and this clearly requires at least 4 units of fuel to succeed. In this case it didn't matter much, since the two failed attempts took only 47 and 48 milliseconds. But, you may sometimes find that there are many attempts of a proof with low fuel settings and finally success with a higher fuel number. In such cases, you may try to find ways to rewrite your proof so that you are not relying on so many unrollings (if possible), or if you decide that you really need that much fuel, then setting the --fuel option to that value can help avoid several slow failures and retries.
- The rest of the statistics report internal Z3 statistics.
  - The rlimit value is a logical resource limit that F\* sets when calling Z3. Sometimes, as we will see shortly, a proof can be "cancelled" in case Z3 runs past this resource limit. You can increase the rlimit in this case, as we'll see below.
  - Of the remaning statistics, perhaps the main one of interest is quant\_instantiations. This records a cumulative total of quantifiers instantiated by Z3 so far in the current session—here, each attempt seems to instantiate around 100–150 quantifiers. This is a very low number, since the query is so simple. You may be wondering why it is even as many as that, since 4 unfolding of factorial suffice, but remember that there are many other quantifiers involved in the encoding, e.g., those that prove that BoxBool is injective etc. A more typical query will see quantifier instantiations in the few thousands.

**Note:** Note, since the quant-instantiations metric is cumulative, it is often useful to precede a query with something like the following:

```
#push-options "--initial_fuel 0 --max_fuel 4 --ifuel 0 --query_stats"
#restart-solver
let _dummy = assert (factorial 0 == 1)
let _test_query_stats = assert (factorial 3 == 6)
```

The #restart-solver creates a fresh Z3 process and the dummy query "warms up" the process by feeding it a trivial query, which will run somewhat slow because of various initialization costs in the solver. Then, the query stats reported for the real test subject starts in this fresh session.

## 46.4.2 Working though a slow proof

Even a single poorly chosen quantified assumption in the prover's context can make an otherwise simple proof take very long. To illustrate, consider the following variation on our example above:

```
assume Factorial_unbounded: forall (x:nat). exists (y:nat). factorial y > x

#push-options "--fuel 4 --ifuel 0 --query_stats"
#restart-solver
let _test_query_stats = assert (factorial 3 == 6)
```

We've now introduced the assumption Factorial\_unbounded into our context. Recall from the SMT encoding of quantified formulas, from the SMT solver's perspective, this looks like the following:

This quantifier has no explicit patterns, but Z3 picks the term (HasType @x0 Prims.nat) as the pattern for the forall quantifier. This means that it can instantiate the quantifier for active terms of type nat. But, a single instantiation of the quantifier, yields the existentially quantified formula. Existentials are immediately skolemized by Z3, i.e., the existentially bound variable is replaced by a fresh function symbol that depends on all the variables in scope. So, a fresh term a @x0 corresponding @x1 is introduced, and immediately, the conjunct HasType (a @x0) Prims.nat becomes an active term and can be used to instantiate the outer universal quantifier again. This "matching loop" sends the solver into a long, fruitless search and the simple proof about factorial 3 == 6 which previously succeeded in a few milliseconds, now fails. Here's are the query stats:

A few things to notice:

• The failure reason is "unknown because canceled". That means the solver reached its resource limit and halted the proof search. Usually, when you see "canceled" as the reason, you could try raising the rlimit, as we'll see

shortly.

- The failure took 5.6 seconds.
- There were 57k quantifier instantiations, as compared to just the 100 or so we had earlier. We'll soon seen how to pinpoint which quantifiers were instantiated too much.

#### Increasing the rlimit

We can first retry the proof by giving Z3 more resources—the directive below doubles the resource limit given to Z3.

```
#push-options "--z3rlimit_factor 2"
```

This time it took 14 seconds and failed. But if you try the same proof a second time, it succeeds. That's not very satisfying.

#### **Repeating Proofs with Quake**

Although this is an artificial example, unstable proofs that work and then suddenly fail do happen. Z3 does guarantee that it is deterministic in a very strict sense, but even the smallest change to the input, e.g., a change in variable names, or even asking the same query twice in a succession in the same Z3 session, can result in different answers.

There is often a deeper root cause (in our case, it's the Factorial\_unbounded assumption, of course), but a first attempt at determining whether or not a proof is "flaky" is to use the F\* option --quake.

```
#push-options "--quake 5/k"
let _test_query_stats = assert (factorial 3 == 6)
```

This tries the guery 5 times and reports the number of successes and failures.

In this case, F\* reports the following:

```
Quake: query (SMTEncoding._test_query_stats, 1) succeeded 4/5 times (best fuel=4, best_____ifuel=0)
```

If you're working to stabilize a proof, a good criterion is to see if you can get the proof to go through with the --quake option.

You can also try the proof by varying the Z3's random seed and checking that it works with several choices of the seed.

```
#push-options "--z3smtopt '(set-option :smt.random_seed 1)'"
```

## 46.4.3 Profiling Quantifier Instantiation

We have a query that's taking much longer than we'd like and from the query-stats we see that there are a lot of quantifier instances. Now, let's see how to pin down which quantifier is to blame.

1. Get F\* to log an .smt2 file, by adding the --log\_queries option. It's important to also add a #restart-solver before just before the definition that you're interested in profiling.

```
#push-options "--fuel 4 --ifuel 0 --query_stats --log_queries --z3rlimit_factor 2"
#restart-solver
let _test_query_stats = assert (factorial 3 == 6)
```

F\* reports the name of the file that it wrote as part of the query-stats. For example:

```
(<input>(18,0-18,49)@queries-SMTEncoding-7.smt2) Query-stats ...
```

2. Now, from a terminal, you run Z3 on this generated .smt2 file, while passing it the following option and save the output in a file.

```
z3 queries-SMTEncoding-7.smt2 smt.qi.profile=true > sample_qiprofile
```

3. The output contains several lines that begin with [quantifier\_instances], which is what we're interested in

```
grep quantifier_instances sample_qiprofile | sort -k 4 -n
```

The last few lines of output look like this:

```
[quantifier_instances] bool_inversion :
                                           352 : 10 : 11
[quantifier_instances] bool_typing :
                                        720 : 10 : 11
[quantifier_instances] constructor_distinct_BoxBool :
                                                         720 : 10 : 11
[quantifier_instances] projection_inverse_BoxBool_proj_0 : 1772 : 10 : 11
[quantifier_instances] primitive_Prims.op_Equality :
                                                       2873 : 10 : 11
[quantifier_instances] int_typing : 3168 : 10 : 11
[quantifier_instances] constructor_distinct_BoxInt :
                                                       3812 : 10 : 11
[quantifier_instances] typing_SMTEncoding.factorial :
                                                        5490 : 10 : 11
[quantifier_instances] int_inversion : 5506 : 11 : 12
[quantifier_instances] @fuel_correspondence_SMTEncoding.factorial.fuel_instrumented_
     5746 : 10 : 11
\hookrightarrow
[quantifier_instances] Prims_pretyping_ae567c2fb75be05905677af440075565:
→11 : 12
[quantifier_instances] projection_inverse_BoxInt_proj_0 :
                                                            6337 : 10 : 11
[quantifier_instances] primitive_Prims.op_Multiply :
                                                       6394 : 10 : 11
[quantifier_instances] primitive_Prims.op_Subtraction :
                                                          6394 : 10 : 11
[quantifier_instances] token_correspondence_SMTEncoding.factorial.fuel_instrumented_
\hookrightarrow
     7629 : 10 : 11
[quantifier_instances] @fuel_irrelevance_SMTEncoding.factorial.fuel_instrumented : __
→ 9249 : 10 : 11
[quantifier_instances] equation_with_fuel_SMTEncoding.factorial.fuel_instrumented :_ ...
→ 13185 : 10 : 10
[quantifier_instances] refinement_interpretation_Tm_refine_
→542f9d4f129664613f2483a6c88bc7c2 : 15346 : 10 : 11
[quantifier_instances] assumption_SMTEncoding.Factorial_unbounded : 15890 : 10 : ...
\hookrightarrow 11
```

Each line mentions is of the form:

```
qid : number of instances : max generation : max cost
```

where,

- qid is the identifer of quantifier in the .smt2 file
- the number of times it was instantiated, which is the number we're most interested in
- the generation and cost are other internal measures, which Nikolaj Bjorner explains here
- 4. Interpreting the results

Clearly, as expected, assumption\_SMTEncoding.Factorial\_unbounded is instantiated the most.

Next, if you search in the .smt2 file for ":qid refinement\_interpretation\_Tm\_refine\_542f9d4f129664613f2483a6c88bc7c2", you'll find the assumption that gives an interpretation to the HasType x Prims.nat predicate, where each instantiation of Factorial\_unbounded yields another instance of this fact.

Notice that equation\_with\_fuel\_SMTEncoding.factorial.fuel\_instrumented is also instantiated a lot. This is because aside from the matching loop due to HasType x Prims.nat, each instantiation of Factorial\_unbounded also yields an occurrence of factorial as a new active term, which the solver then unrolls up to four times.

We also see instantiations of quantifiers in Prims and other basic facts like int\_inversion, bool\_typing etc. Sometimes, you may even find that these quantifiers fire the most. However, these quantifiers are inherent to F\*'s SMT encoding: there's not much you can do about it as a user. They are usually also not to blame for a slow proof—they fire a lot when other terms are instantiated too much. You should try to identify other quantifiers in your code or libraries that fire a lot and try to understand the root cause of that.

#### **Z3 Axiom Profiler**

The Z3 Axiom Profiler can also be used to find more detailed information about quantifier instantiation, including which terms we used for instantiation, dependence among the quantifiers in the form of instantiation chains, etc.

However, there seem to be some issues with using it at the moment with Z3 logs generated from F\*.

### 46.4.4 Splitting Queries

In the next two sections, we look at a small example that Alex Rozanov reported, shown below. It exhibits similar proof problems to our artificial example with factorial. Instead of just identifying the problematic quantifier, we look at how to remedy the performance problem by revising the proof to be less reliant on Z3 quantifier instantiation.

```
module Alex
let unbounded (f: nat -> int) = forall (m: nat). exists (n:nat). abs (f n) > m
assume
val f : (f:(nat -> int){unbounded f})
let g : (nat \rightarrow int) = fun x \rightarrow f (x+1)
#push-options "--fuel 0 --ifuel 0 --z3smtopt '(set-option :smt.qi.eager_threshold 2)'"
let find_above_for_g (m:nat) : Lemma(exists (i:nat). abs(g i) > m) =
  assert (unbounded f); // apply forall to m
  eliminate exists (n:nat). abs(f n) > m
  returns exists (i:nat). abs(g i) > m with _. begin
    let m1 = abs(f n) in
    assert (m1 > m); //prover hint
    if n>=1 then assert (abs(g (n-1)) > m)
    else begin
      assert (n<=0); //arithmetics hint</pre>
      eliminate exists (n1:nat). abs (f n1) > m1
      returns exists (i:nat). abs(g i) > m with _.
      begin
        assert (n1 > 0);
        assert (abs (g (n1-1)) > m)
      end
```

```
end
end
```

The hypothesis is that unbounded f has exactly the same problem as the our unbounded hypothesis on factorial—the forall/exists quantifier contains a matching loop.

This proof of find\_above\_for\_g succeeds, but it takes a while and F\* reports:

```
(Warning 349) The verification condition succeeded after splitting it to localize potential errors, although the original non-split verification condition failed. If you want to rely on splitting queries for verifying your program please use the '--split_queries always' option rather than relying on it implicitly.
```

By default, F\* collects all the proof obligations in a top-level F\* definition and presents it to Z3 in a single query with several conjuncts. Usually, this allows Z3 to efficiently solve all the conjuncts together, e.g., the proof search for one conjunct may yield clauses useful to complete the search for other clauses. However, sometimes, the converse can be true: the proof search for separate conjuncts can interfere with each other negatively, leading to the entire proof to fail even when every conjunct may be provable if tried separately. Additionally, when F\* calls Z3, it applies the current rlimit setting for every query. If a query contains N conjuncts, splitting the conjuncts into N separate conjuncts is effectively a rlimit multiplier, since each query can separately consume resources as much as the current rlimit.

If the single query with several conjunct fails without Z3 reporting any further information that F\* can reconstruct into a localized error message, F\* splits the query into its conjuncts and tries each of them in isolation, so as to isolate the failing conjunct it any. However, sometimes, when tried in this mode, the proof of all conjuncts can succeed.

One way to respond to Warning 349 is to follow what it says and enable --split\_queries always explicitly, at least for the program fragment in question. This can sometimes stabilize a previously unstable proof. However, it may also end up deferring an underlying proof-performance problem. Besides, even putting stability aside, splitting queries into their conjuncts results in somewhat slower proofs.

### 46.4.5 Taking Control of Quantifier Instantiations with Opaque Definitions

Here is a revision of Alex's program that addresses the quantifier instantiation problem. There are a few elements to the solution.

```
[@@"opaque_to_smt"]
let unbounded (f: nat → int) = forall (m: nat). exists (n:nat). abs (f n) > m

let instantiate_unbounded (f:nat → int { unbounded f }) (m:nat)
    : Lemma (exists (n:nat). abs (f n) > m)
    = reveal_opaque (`%unbounded) (unbounded f)

assume
val f : (z:(nat → int){unbounded z})

let g : (nat -> int) = fun x -> f (x+1)

#push-options "--query_stats --fuel 0 --ifuel 0"
let find_above_for_g (m:nat) : Lemma(exists (i:nat). abs(g i) > m) =
    instantiate_unbounded f m;
    eliminate exists (n:nat). abs(f n) > m
    returns exists (i:nat). abs(g i) > m with _. begin
```

```
let m1 = abs(f n) in
if n>=1 then assert (abs(g (n-1)) > m)
else begin
   instantiate_unbounded f m1;
   eliminate exists (n1:nat). abs (f n1) > m1
   returns exists (i:nat). abs(g i) > m with _.
   begin
      assert (abs (g (n1-1)) > m)
   end
end
end
```

#### 1. Marking definitions as opaque

The attribute [@@"opaque\_to\_smt"] on the definition of unbounded instructs F\* to not encode that definition to the SMT solver. So, the problematic alternating quantifier is no longer in the global scope.

#### 2. Selectively revealing the definition within a scope

Of course, we still want to reason about the unbounded predicate. So, we provide a lemma, instantiate\_unbounded, that allows the caller to explicity instantiate the assumption that f is unbounded on some lower bound m.

To prove the lemma, we use FStar.Pervasives.reveal\_opaque: its first argument is the name of a symbol that should be revealed; its second argument is a term in which that definition should be revealed. It this case, it proves that unbounded f is equal to forall m. exists n. abs (f n) > m.

With this fact available in the local scope, Z3 can prove the lemma. You want to use reveal\_opaque carefully, since with having revealed it, Z3 has the problematic alternating quantifier in scope and could go into a matching loop. But, here, since the conclusion of the lemma is exactly the body of the quantifier, Z3 quickly completes the proof. If even this proves to be problematic, then you may have to resort to tactics.

#### 3. Explicitly instantiate where needed

Now, with our instantiation lemma in hand, we can precisly instantiate the unboundedness hypothesis on f as needed.

In the proof, there are two instantiations, at m and m1.

Note, we are still relying on some non-trivial quantifier instantiation by Z3. Notably, the two assertions are important to instantiate the existential quantifier in the returns clause. We'll look at that in more detail shortly.

But, by making the problematic definition opaque and instantiating it explicitly, our performance problem is gone—here's what query-stats shows now.

This wiki page provides more information on selectively revealing opaque definitions.

### 46.4.6 Other Ways to Explicitly Trigger Quantifiers

For completeness, we look at some other ways in which quantifier instantiation works.

#### **An Artificial Trigger**

Instead of making the definition of unbounded opaque, we could protect the universal quantifier with a pattern using some symbol reserved for this purpose, as shown below.

```
let trigger (x:int) = True
let unbounded_alt (f: nat \rightarrow int) = forall (m: nat). {:pattern (trigger m)} (exists_
\rightarrow (n:nat). abs (f n) > m)
assume
val ff : (z:(nat \rightarrow int)\{unbounded\_alt z\})
let gg : (nat -> int) = fun x -> ff (x+1)
#push-options "--query_stats --fuel 0 --ifuel 0"
let find_above_for_gg (m:nat) : Lemma(exists (i:nat). abs(gg i) > m) =
  assert (unbounded_alt ff);
  assert (trigger m);
  eliminate exists (n:nat). abs(ff n) > m
  returns exists (i:nat). abs(gg i) > m with _. begin
    let m1 = abs(ff n) in
    if n>=1 then assert (abs(gg (n-1)) > m)
    else begin
      assert (trigger m1);
      eliminate exists (n1:nat). abs (ff n1) > m1
      returns exists (i:nat). abs(gg i) > m with _.
        assert (abs (gg (n1-1)) > m)
      end
    end
  end
```

- 1. We define a new function trigger x that is trivially true.
- 2. In unbounded\_alt we decorate the universal quantifier with an explicit pattern, {:pattern (trigger x)}. The pattern is not semantically relevant—it's only there to control how the quantifier is instantiated
- 3. In find\_above\_for\_gg, whenever we want to instantiate the quantifier with a particular lower bound k, we assert trigger k. That gives Z3 an active term that mentions trigger which it then uses to instantiate the quantifier with our choice of k.

This style is not particularly pleasant, because it involves polluting our definitions with semantically irrelevant triggers. The selectively revealing opaque definitions style is much preferred. However, artificial triggers can sometimes be useful.

#### **Existential quantifiers**

We have an existential formula in the goal exists (i:nat). abs(g i) > m and Z3 will try to solve this by finding an active term to instantiate i. In this case, the patterns Z3 picks is (g i) as well the predicate (HasType i Prims. nat), which the SMT encoding introduces. Note, F\* does not currently allow the existential quantifier in a returns annoation to be decorated with a pattern—that will likely change in the future.

Since g i is one of the patterns, by asserting abs (g (n - 1)) > m in one branch, and abs (g (n1 - 1)) > m in the other, Z3 has the terms it needs to instantiate the quantifier with n - 1 in one case, and n1 - 1 in the other case.

In fact, any assertion that mentions the g (n - 1) and g (n1 - 1) will do, even trivial ones, as the example below shows.

```
let find_above_for_g1 (m:nat) : Lemma(exists (i:nat). abs(g i) > m) =
  instantiate_unbounded f m;
  eliminate exists (n:nat). abs(f n) > m
  returns exists (i:nat). abs(g i) > m with _. begin
  let m1 = abs(f n) in
  if n>=1 then assert (trigger (g (n-1)))
  else begin
   instantiate_unbounded f m1;
  eliminate exists (n1:nat). abs (f n1) > m1
  returns exists (i:nat). abs(g i) > m with _.
  begin
   assert (trigger (g (n1-1)))
  end
  end
  end
end
```

We assert trigger (g (n - 1)) and trigger (g (n1 - 1)), this gives Z3 active terms for g (n - 1) and g (n1 - 1), which suffices for the instantiation. Note, asserting trigger (n - 1) is not enough, since that doesn't mention g.

However, recall that there's a second pattern that's also applicable (HasType i Prims.nat)—we can get Z3 to instantiate the quantifier if we can inject the predicate (HasType (n - 1) nat) into Z3's context. By using trigger\_nat, as shown below, does the trick, since  $F^*$  inserts a proof obligation to show that the argument x in trigger\_nat x validates (HasType x Prims.nat).

```
let trigger_nat (x:nat) = True
let find_above_for_g2 (m:nat) : Lemma(exists (i:nat). abs(g i) > m) =
  instantiate_unbounded f m;
  eliminate exists (n:nat). abs(f n) > m
  returns exists (i:nat). abs(g i) > m with _. begin
   let m1 = abs(f n) in
   if n>=1 then assert (trigger_nat (n-1))
   else begin
      instantiate_unbounded f m1;
      eliminate exists (n1:nat). abs (f n1) > m1
     returns exists (i:nat). abs(g i) > m with _.
     begin
        assert (trigger_nat (n1-1))
      end
    end
  end
```

Of course, rather than relying on implicitly chosen triggers for the existentials, one can be explicit about it and provide the instance directly, as shown below, where the introduce exists ... in each branch directly provides the witness rather than relying on Z3 to find it. This style is much preferred, if possible, than relying implicit via various implicitly chosen patterns and artificial triggers.

```
let find_above_for_g' (m:nat) : Lemma(exists (i:nat). abs(g i) > m) =
 instantiate_unbounded f m;
 eliminate exists (n:nat). abs(f n) > m
 returns _ // exists (i:nat). abs(g i) > m
 with _. begin
   let m1 = abs(f n) in
   if n>=1 then (
      introduce exists (i:nat). abs(g i) > m
     with (n - 1)
      and ()
   )
   else begin
      instantiate_unbounded f m1;
      eliminate exists (n1:nat). abs (f n1) > m1
     returns _ //exists (i:nat). _ abs(g i) > m
      with _.
       begin
          introduce exists (i:nat). abs (g i) > m
          with (n1 - 1)
          and ()
        end
   end
 end
```

Here is a link to the the full file with all the variations we have explored.

## 46.4.7 Overhead due to a Large Context

Consider the following program:

The lemma test1 is a simple property about FStar.Seq, but the lemma occurs in a module that also depends on a large number of other modules—in this case, about 177 modules from the F\* standard library. All those modules are encoded to the SMT solver producing about 11MB of SMT2 definitions with nearly 20,000 assertions for the solver to process. This makes for a large search space for the solver to explore to find a proof, however, most of those assertions are quantified formulas guarded by patterns and they remain inert unless some active term triggers them. Nevertheless,

all these definitions impose a noticeable overhead to the solver. If you turn --query\_stats on (after a single warm-up query), it takes Z3 about 300 milliseconds (and about 3000 quantifier instantiations) to find a proof for test1.

You probably won't really notice the overhead of a proof that takes 300 milliseconds—the F\* standard library doesn't have many quantifiers in scope with things like bad quantifier alternation that lead to matching loops. However, as your development starts to depend on an ever larger stack of modules, there's the danger that at some point, your proofs are impacted by some bad choice of quantifiers in some module that you have forgotten about. In that case, you may find that seemingly simple proofs take many seconds to go through. In this section, we'll look at a few things you can do to diagnose such problems.

#### Filtering the context

The first thing we'll look at is an F\* option to remove facts from the context.

The --using\_facts\_from option retains only facts from modules that match the namespace-selector string provided. In this case, the selector shrinks the context from 11MB and 20,000 assertions to around 1MB and 2,000 assertions and the query stats reports that the proof now goes through in just 15 milliseconds—a sizeable speedup even though the absolute numbers are still small.

Of course, deciding which facts to filter from your context is not easy. For example, if you had only retained FStar. Seq and forgot to include Prims, the proof would have failed. So, the --using\_facts\_from option isn't often very useful.

#### **Unsat Core and Hints**

When Z3 finds a proof, it can report which facts from the context were relevant to the proof. This collection of facts is called the unsat core, because Z3 has proven that the facts from the context and the negated goal are unsatisfiable. F\* has an option to record and replay the unsat core for each query and F\* refers to the recorded unsat cores as "hints".

Here's how to use hints:

1. Record hints

```
fstar.exe --record_hints ContextPollution.fst
```

This produces a file called ContextPollution.fst.hints

The format of a hints file is internal and subject to change, but it is a textual format and you can roughly see what it contains. Here's a fragment from it:

```
[
   "ContextPollution.test1",
   1,
   2,
   1,
   [
```

```
"@MaxIFuel_assumption", "@query", "equation_Prims.nat",
"int_inversion", "int_typing", "lemma_FStar.Seq.Base.lemma_eq_intro",
"lemma_FStar.Seq.Base.lemma_index_app1",
"lemma_FStar.Seq.Base.lemma_index_app2",
"lemma_FStar.Seq.Base.lemma_len_append",
"primitive_Prims.op_Addition", "primitive_Prims.op_Subtraction",
"projection_inverse_BoxInt_proj_0",
"refinement_interpretation_Tm_refine_542f9d4f129664613f2483a6c88bc7c2",
"refinement_interpretation_Tm_refine_ac201cf927190d39c033967b63cb957b",
"refinement_interpretation_Tm_refine_d83f8da8ef6c1cb9f71d1465c1bb1c55",
"typing_FStar.Seq.Base.append", "typing_FStar.Seq.Base.length"
],
0,
"3f144f59e410fbaa970cffb0e20df75d"
]
```

This is the hint entry for the query with whose id is (ContextPollution.test1, 1)

The next two fields are the fuel and ifuel used for the query, 2 and 1 in this case.

Then, we have the names of all the facts in the unsat core for this query: you can see that it was only about 20 facts that were needed, out of the 20,000 that were originally present.

The second to last field is not used—it is always 0.

And the last field is a hash of the query that was issued.

#### 2. Replaying hints

The following command requests F\* to search for ContextPollution.fst.hints in the include path and when attempting to prove a query with a given id, it looks for a hint for that query in the hints file, uses the fuel and ifuel settings present in the hints, and prunes the context to include only the facts present in the unsat core.

```
fstar.exe --use_hints ContextPollution.fst
```

Using the hints usually improves verification times substantially, but in this case, we see that the our proof now goes through in about 130 milliseconds, not nearly as fast as the 15 milliseconds we saw earlier. That's because when using a hint, each query to Z3 spawns a new Z3 process initialized with just the facts in the unsat core, and that incurs some basic start-up time costs.

Many F\* projects use hints as part of their build, including F\*'s standard library. The .hints files are checked in to the repository and are periodically refreshed as proofs evolve. This helps improve the stability of proofs: it may take a while for a proof to go through, but once it does, you can record and replay the unsat core and subsequent attempts of the same proof (or even small variations of it) can go through quickly.

Other projects do not use hints: some people (perhaps rightfully) see hints as a way of masking underlying proof performance problems and prefer to make proofs work quickly and robustly without hints. If you can get your project to this state, without relying on hints, then so much the better for you!

#### **Differential Profiling with approfdiff**

If you have a proof that takes very long without hints but goes through quickly with hints, then the hints might help you diagnose why the original proof was taking so long. This wiki page describes how to compare two Z3 quantifier instantiation profiles with a tool that comes with Z3 called qprofdiff.

#### Hints that fail to replay

Sometimes, Z3 will report an unsat core, but when F\* uses it to try to replay a proof, Z3 will be unable to find a proof of unsat, and F\* will fall back to trying the proof again in its original context. The failure to find a proof of unsat from a previously reported unsat core is not a Z3 unsoundness or bug—it's because although the report core is really logically unsat, finding a proof of unsat may have relied on quantifier instantiation hints from facts that are not otherwise semantically relevant. The following example illustrates.

```
module HintReplay
assume
val p (x:int) : prop

assume
val q (x:int) : prop

assume
val r (x:int) : prop

assume P_Q : forall (x:int). {:pattern q x} q x ==> p x
assume Q_R : forall (x:int). {:pattern p x} q x ==> r x

let test (x:int { q x }) = assert (r x)
```

Say you run the following:

```
fstar --record_hints HintReplay.fst
fstar --query_stats --use_hints HintReplay.fst
```

You will see the following output from the second run:

```
(HintReplay.fst(15,27-15,39)) Query-stats (HintReplay.test, 1) failed
  {reason-unknown=unknown because (incomplete quantifiers)} (with hint)
  in 42 milliseconds ...

(HintReplay.fst(15,27-15,39)) Query-stats (HintReplay.test, 1) succeeded
  in 740 milliseconds ...
```

The first attempt at the query failed when using the hint, and the second attempt at the query (without the hint) succeeded.

To see why, notice that to prove the assertion  $\mathbf{r}$   $\mathbf{x}$  from the hypothesis  $\mathbf{q}$   $\mathbf{x}$ , logically, the assumption Q\_R suffices. Indeed, if you look in the hints file, you will see that it only mentions HintReplay.Q\_R as part of the logical core. However, Q\_R is guarded by a pattern  $\mathbf{p}$   $\mathbf{x}$  and in the absence of the assumption P\_Q, there is no way for the solver to derive an active term  $\mathbf{p}$   $\mathbf{x}$  to instantiate Q\_R—so, with just the unsat core, it fails to complete the proof.

Failures for hint replay usually point to some unusual quantifier triggering pattern in your proof. For instance, here we used  $p \ x$  as a pattern, even though  $p \ x$  doesn't appear anywhere in  $Q_R$ —that's not usually a good choice, though

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sometimes, e.g., when using artificial triggers it can come up.

This wiki page on hints provides more information about diagnosing hint-replay failures, particularly in the context of the Low\* libraries.