

Day, Laurence E. (2017) The modular compilation of effects. PhD thesis, University of Nottingham.

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THE UNIVERSITY OF NOTTINGHAM

DOCTORAL THESIS

The Modular Compilation of Effects

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A thesis submitted in fulfilment of the requirements for the degree of Doctor of Philosophy

in the

Functional Programming Laboratory
School of Computer Science

December 2014

THE UNIVERSITY OF NOTTINGHAM

Abstract

The Modular Compilation of Effects

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The introduction of new features to a programming language often requires that its compiler goes to the effort of ensuring they are introduced in a manner that does not interfere with the existing code base. Engineers frequently find themselves changing code that has already been designed, implemented and (ideally) proved correct, which is bad practice from a software engineering point of view.

This thesis addresses the issue of constructing a compiler for a source language that is modular in the computational features that it supports. Utilising a minimal language that allows us to demonstrate the underlying techniques, we go on to introduce a significant range of effectful features in a modular manner, showing that their syntax can be compiled independently, and that source languages containing multiple features can be compiled by making use of a fold.

In the event that new features necessitate changes in the underlying representation of either the source language or that of the compiler, we show that our framework is capable of incorporating these changes with minimal disruption. Finally, we show how the framework we have developed can be used to define both modular evaluators and modular virtual machines.

Acknowledgements

First and foremost, I would like to thank my supervisor, Professor Graham Hutton, for both agreeing to supervise me in the first place and then putting up with me for the subsequent four years. I am not a model student, and his patience and shared knowledge has made me both a better scientist and a better person. Thank you, Graham.

Secondly, I would like to thank the members of the Functional Programming Laboratory – in particular those in Room A04 – for making it a particularly exciting and entertaining place in which to study. My particular thanks go to Thorsten Altenkirch, Venanzio Capretta, Neil Sculthorpe, Joey Capper, Jennifer Hackett, Ambrus Kaposi, Bas van Gijzel and Nicolai Kraus. I'm sorry I'm no longer around to distract you, and wish you every success.

I had the pleasure of meeting Patrick Bahr during the first year of my PhD, and the good fortune to have him join the laboratory in Nottingham on a research grant for six months in 2013. Patrick, you taught me more about how Haskell works than any other source, and as a co-author you're a genuine godsend. My doctorate is largely indebted to you, and I owe you drinks from now until the end of time.

Outside of the laboratory, there are a number of people – both academic colleagues and friends – who were my social bedrock throughout the time it took to write this. In particular, I would like to thank Michael Hoy, Joe

Nash, Paula Besson, Alex Pinkney, and Michael Gale. You're all life-savers. You still have to buy your own drinks, though.

I'd also like to thank those who first set me on my path as a scientist. To this end, my teachers at St Peter's College between 2002 and 2006, specifically Julia Bailey, Adam Dobson and Karen Hulme, are in no small part responsible for how I turned out. In particular, Karen is to thank for my decision to both study mathematics at University and undertake graduate study. May you all continue to inspire the South African youth they're lucky to have you.

Of course, my parents, Edward and Noeleen Day, are the ones who raised me in such a way that I was in the fortunate position to undertake this PhD in the first place. Mum, Dad - I appreciate everything you have done for me more than you'll ever know, and I promise I'll get a real job now.

When it came down to actually reading and proposing corrections for this thesis, my examiners Dr Henrik Nilsson and Dr Edwin Brady were far more patient than I deserve. Thank you for all of your insights.

Finally, I would like to thank my wife, Dr Nichola Eales, for her unwavering support from the first day we met as undergraduates at Nottingham. More than anyone else, you are the one most responsible for my successes, both as an academic and otherwise. I love you.

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For Nichola.

Chapter 1

Introduction

For as long as programs have been written, significant effort has gone into the process of making it easier to do. Whilst the first programs were written in machine code and executed directly by a processor, the evolution of programming languages has both significantly increased the productivity of programmers and the readability of their programs. One consequence of this is the existence of an ever-widening semantic gap between the language that a program is written in and its realisation in machine code. The tools used in order to close this gap represent an important branch of software engineering. We call such tools *compilers*, and the topics involved in their development represent a microcosm of modern computer science.

1.1 An Aside: What Are Compilers?

Put simply, compilers translate programming languages. The general case is that the source language – the language we compile from – is at a higher level of abstraction than the target language we compile into (although decompilers – which perform the reverse operation of 'abstracting' low-level code into a more human-readable form – are also common). With this said, compilers that translate between high-level source languages do exist, and are known as source-to-source compilers, or transpilers for short.

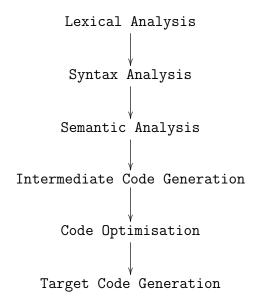
Whilst the history of compilation theory and implementation is a substantial topic on its own, credit is generally given to Grace Hopper for creating the first compiler in 1952 whilst working on the UNIVAC project at Remington Rand [Hop87]. However, the FORTRAN compiler of IBM – released five years later by Backus et al [BBB+57] – is considered the first compiler designed for a standalone source language. The motivation for these projects was more pragmatic than anything else - machine code was tedious to write by hand, and such code had to be rewritten for each new architecture.

Whilst the introduction of the first generation of compilers undoubtedly spared software writers from significant effort by way of code maintenance, the code that they produced was often slower than manually-written, hand-optimised machine code. To this end, the work of Frances Allen and John

Cocke [All70, AC76, AC71] introduces some of the first optimising code transformations such as common subexpression elimination and operator strength reduction. Today, modern compilers can produce better quality code than expert human programmers.

1.2 An Aside: How Are Compilers Constructed?

A typical compiler consists of multiple distinct phases. Whilst individual compilers can vary greatly in their internal workings, the overarching themes of these phases – and their relationships – are given below:



It is not the purpose of this section to explain the complexities involved in the manipulations and transformations that comprise an industrial strength compiler. For this, a number of seminal, comprehensive works are available [ASU86, App97, PJ87]. However, we briefly sketch out the primary purpose of each phase below:

- Lexical Analysis: the *lexer* of a compiler steps through the textual representation of a source program and produces a sequence of tokens, or *lexemes*, which comprise the individual syntactic components of a program. For example, for C-like languages the lexer produces a token corresponding to a separator when it encounters a plaintext semicolon, and distinguishes between the reserved words of the language and other strings used as variable identifiers when it encounters alphabetic strings.
- Syntax Analysis: the *parser* of a compiler works in conjunction with the lexer to produce the *abstract syntax tree* of the source program.
- Semantic Analysis: the *typechecker* performs static checks on operands and variables within the program to avoid errors such as trying to add a string to an integer. This phase also performs any syntactic checks that do not fall within the remit of a parser, such as ensuring that any occurrences of break occur within conditional blocks.
- Intermediate Code Generation: generates an intermediate representation (IR) of the source program that is suitable for further

manipulation. The exact structure of an IR varies depending on the language in question, but in general IRs need to be rich enough to successfully capture the semantics of the source language whilst simultaneously being close enough to the target language so as to simplify the final code generation phase.

- Code Optimisation: the *optimiser* of a compiler applies a series of transformations to the IR in order to produce better target code. The optimisation phase can run as a fixed-point computation: optimisations are repeatedly applied until no change is detected in the resulting code. As a result, optimisation can be the most time-consuming task of a compiler.
- Target Code Generation: the final phase of a compiler produces target code from the optimised IR. This phase deals with low-level issues, such as register allocation and assignment of explicit jump addresses.

1.3 Re-Envisioning Intermediate

Code Generation

The intermediate code generation phase can be viewed as the 'middle-end' of a compiler, with the collection of all phases occurring before it referred to as the front-end, and everything after as the back-end. If we assume that the IR being used is universal these collections are composable, with the existence of m front-ends and n back-ends giving rise to $(m \times n)$ distinct compilers. In practice, however, this is not the case, with the internal structure of various classes of IR differing greatly between compilers (representative instances include RTL [DF80], SSA [CFR+91] and CIL [NMRW02]).

We note that the analyses performed in the front-end generally exist to guarantee the sound and well-formed nature of the syntax of a source program. Further, they happen at a fairly high level, with the deepest analysis taking place typically being static type inference.

1.4 What Does This Thesis Present?

This thesis presents a unique re-factorisation of the *intermediate code generation* phase of a compiler with a particular style of IR representation at the middle-end, namely a stack-based sequence of low-level instructions. We explore the idea that the intermediate code generation phase can be constructed in a manner wherein said IR is modular in the features of the source language: in particular, we will see that the necessary IR can be derived for a given source language, and the amount of work required to

implement the entire phase is reduced to defining the 'compilation semantics' for each feature in isolation.

We present our implementation of this concept within the pure, statically-typed functional language Haskell [HHPJW07]. More precisely, we present an embedded compiler (i.e. the compiler is written in Haskell as a function) that operates over domain-specific languages (DSLs) also defined within Haskell. The word compiler is overloaded here; from this point onwards, when we say 'compiler' we refer to the function performing the intermediate code generation, 'source language' refers to the domain-specific language representing the abstract syntax tree of a source program, and 'target language' refers to the IR we are compiling into.

1.4.1 Contributions & Thesis Structure

The main contributions of this thesis are as follows:

- Chapter 5.1 shows how the usage of generalised algebraic datatypes to model particular syntactic constructs permits the capture of existential type constraints in a clean and modular manner.
- Chapter 5.2 extends our compilation framework with syntactic support for both mutable state and variable binding via the lambda-calculus, with support for two distinct evaluation schemes.

- Chapter 5.3.1 examines the issue of effects that do not commute (e.g. exceptions and mutable state), which may require a source program to be compiled in different ways depending on the order in which effects are manifested. We present three distinct techniques that can be used to solve this concern, operating over both the type and function level.
- Chapter 6.1 gives our source language further expressive power by introducing syntax supporting for-loops, while-loops, conditionals and sequencing. As a consequence of this, we identify a potential class of ill-formed program that can arise when programming imperatively without sufficient safeguards. We eliminate this concern by refactoring the source language as a typed variant of Johann and Ghani's fixpoint representation of generalised algebraic datatypes [JG08].
- Chapter 6.4.1 demonstrates the usage of Oliveira and Cook's structured graphs [OC12] as the underpinning of a refined representation of the target language, and show how the additional structure that they provide allows the compilation of non-cyclic control structures in a modular manner without code duplication. More importantly, this new representation permits the modular compilation of cyclic control structures, which we demonstrate by way of an extended example.

The ideas that we present first appeared in the following series of papers, with the author of this thesis serving as the lead author for each paper:

- Laurence E. Day and Graham Hutton [DH11], "Towards Modular Compilers for Effects", in the Proceedings of the 12th International Symposium on Trends in Functional Programming.
- 2. Laurence E. Day and Graham Hutton [DH13], "Compilation à la Carte", in the Proceedings of the 25th International Symposium on the Implementation and Application of Functional Languages.
- 3. Laurence E. Day and Patrick Bahr [DB14], "Pick'n'Fix: Capturing Control Flow in Modular Compilers", in the *Proceedings of the 15th International Symposium on Trends in Functional Programming*.

We highlight at this point that the initial idea to use structured graphs when treating cyclic control structures is credited to Dr. Patrick Bahr, and thank him for this substantial contribution. The remainder of the ideas presented are those of the author himself.

The thesis is hereafter structured in the following way.

Chapter 2 frames the problem this thesis aims to solve by way of an extended example involving the extension of a minimal example with additional syntax implementing a new effect.

Chapter 3 provides a primer in the background theory required, together with a review of existing literature on topics related to language semantics and modelling computation.

In Chapter 4, we lay the groundwork for our modular compilation framework, introducing the notions of modular syntax for a small language, its modular semantics, and a first attempt at a modular compilation function.

We extend this framework in Chapter 5, adding further expressive power by way of new syntax supporting mutable state and the lambda calculus, and refine the representation of the source language in order to better enforce constraints upon individual syntax fragments. Furthermore, we present a number of novel solution to the issues that arise when the modular syntax of different effects interacts in unexpected ways.

In Chapter 6 we introduce the notions of control flow and conditionals, and further refine the source language with a surface-level type system in the presence of the various syntactic categories needed to eliminate a particular class of ill-formed program that result. Following this, we turn our attention to the representation of the target language, opting for a more flexible approach better suited to cyclic programs.

Chapter 7 provides a thorough treatment of a modular implementation of the semantics of the refined target language, by way of a virtual machine.

Finally Chapter 8 concludes the thesis by reflecting upon the overall work, and by discussing several potential research avenues aimed at extending the topics that have been presented throughout.

Chapter 2

Setting the Scene

In this chapter, we introduce the problem domain that we address in this thesis by way of an extended example. Specifically, we detail the issues that arise when we extend a domain-specific language (DSL) embedded in Haskell with syntax associated with a new computational effect. We note that a number of existing datatypes and functions associated with the DSL require extension in order to accommodate the extension, either by altering their type signatures or by introducing new constructors and definitions. We recognise that this scenario is a classic example of the Expression Problem [Wad98], and position ourselves to present the fundamentals of our solution framework in the next chapter.

2.1 Building From The Ground Up

Consider a simple language Expr comprising integer values and binary addition, for which we can give a denotational semantics by means of a function that evaluates an expression to an integer value (we make the assumption here that expressions are both finite and everywhere well-defined):

```
data Expr = Val Int | Add Expr Expr
```

```
eval :: Expr \rightarrow Int

eval (Val n) = n

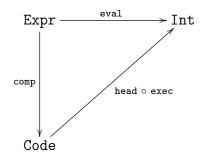
eval (Add x y) = eval x + eval y
```

Alternatively, expressions can be compiled into a sequence of low-level instructions to be operated upon by a virtual machine, whose behaviour is defined as a (small-step) operational semantics. We can compile an expression to a list of operations as follows:

```
comp' :: Expr \rightarrow Code \rightarrow Code comp' (Val n) c = PUSH n : c comp' (Add x y) c = comp' x (comp' y (ADD : c))
```

Note that the above compiler is defined in terms of an auxiliary function comp' which accepts an additional Code argument playing the role of a continuation, thereby avoiding the use of the append operator (++) and enabling simpler proofs as in Chapter 13 of [Hut07]. We execute the Code resulting from the above on a (partial) virtual machine operating over a Stack:

The correctness of the abovementioned compiler can now be captured by stating that the result of evaluating a *finite* expression is equivalent to first compiling and then executing it, and then selecting the topmost value on the stack. This can be expressed in diagrammatic form as follows:



We make explicit at this point that we do not consider infinite source expressions to be well-typed for the purposes of this thesis.

2.2 Adding A New Effect

Suppose now that we wish to extend our language with a new effect, in the form of exceptions. We consider what changes will need to be made to the language syntax, semantics, compiler and virtual machine as a result of this extension. First of all, we extend Expr with two new constructors:

The newly introduced Throw constructor corresponds to an uncaught exception, while Catch is a handler construct that returns the value of its

first argument unless it is an uncaught exception, in which case it returns the value of its second argument instead.

From a semantic point of view, adding exceptions to the language requires changing the result type of the evaluation function from Value to Maybe Value in order to accommodate potential failure when evaluating expressions, noting that whilst the original eval function has result type Int, it can implicitly be seen as being wrapped in an Identity monad: an idea that we shall explore in later chapters. In turn, we must rewrite the semantics of values and addition accordingly, and define an appropriate semantics for throwing and catching (once again abusing Haskell syntax for the purposes of defining our denotational semantics):

In the above code, we exploit the fact that Maybe is monadic, as we will see in Chapter 3.3.2. In particular, because Maybe is also a monoid — a structure with an associative binary operation and an identity element —

we make use of the monoidal methods mzero, corresponding to failure, and mplus, for sequential choice. Finally, in order to compile exceptions we must introduce new stack instructions to the virtual machine, and extend the compiler accordingly:

Intuitively, THROW is an operation that throws an exception, MARK makes a record on the stack of the handler code to be executed should the first argument of a Catch expression fail, and UNMARK indicates that no uncaught exceptions were encountered in the most recent Catch-block and that the topmost handler code on the stack can be removed. Note that the accumulator c plays a key role in the compilation of Catch, being used in two places to represent the code to be executed after the current compilation. Also note, however, that this leads to explicit code duplication!

Because we now need to keep track of handler code on the stack as well as integer values, we must also extend the Item datatype and the virtual machine to cope with both the new operations and the potential for failure:

```
data Item = INT Int | HAN Code
exec :: Code -> Maybe Stack
exec c = exec' c []
```

The auxiliary unwind function used in the above implements the process of invoking handler code in the case of a caught exception, by executing the topmost Code record on the stack, and failing if no such record exists:

```
unwind :: Stack -> Maybe Stack
```

unwind [] = mzero

unwind (INT _ : s) = unwind s

unwind (HAN h : s) = exec' h s

2.3 The Problem At Hand

As the reader can appreciate, extending such a simple source language with constructors which enable additional expressive power (which we will refer to as an 'effect' from this point onwards) can result in multiple changes to existing code being required. For our example in particular, we needed to extend three datatypes (Expr, Op and Item), change the return type and existing definition of three functions (eval, exec and exec'), and extend the definition of all functions involved.

The need to modify and extend existing code for each new effect we wish to introduce to our language is clearly at odds with the desire to structure a compiler in a modular manner, and raises a number of problems. Importantly, unless there is familiarity with the workings of *all* aspects of the language rather than just the feature being added, changing existing code that has already been designed, implemented and (ideally) proved correct is bad practice from a software engineering point of view.

At this point, however, we should clarify our intentions towards the usage of the word 'modular' throughout the rest of this thesis. Firstly, when we refer to a modular language, we refer to the syntax for the various effects it supports being defined in a manner such that we are capable of selecting the language that contains precisely the expressive power we desire. Whilst languages can also be modularised along the axes of static vs dynamic semantics, we will not explore this idea further here. Secondly, when we refer to a modular compiler, we allude to a very high-level 'black box' that accepts a source language expression and produces corresponding, lower-level code according to a dynamic/execution semantics, with the box itself constructed from several smaller boxes, with each one entirely self-contained and responsible for translating the constructors associated with a particular effect.

One might wonder why we have chosen to explore this problem domain by defining compilers for embedded DSLs (i.e. languages defined within Haskell itself) in a modular (as we have circumscribed the word) manner. We have made this choice because it is an ideally rich source topic from which to draw interesting and complex problems, concerning both extensibility and the interaction of common effects. With this in mind, we present an initial – rudimentary – solution in Chapter 4, which we will then refine and extend throughout the remainder of the thesis.

One final point to be made here is that whilst Haskell serves as a reasonable

vehicle for modelling what *happens* on a virtual machine, a real virtual machine wouldn't be implemented in Haskell! A more realistic choice would be C, however the translation between the two is fairly straightforward, modulo a more formal treatment of the instruction set and addressing modes.

Chapter 3

Background Knowledge

As mentioned previously, we have chosen Haskell as the implementation language for the work we will present throughout this thesis. However, Haskell – as a pure language – is well-known in the wider programming community for its approach to implementing side-effects [Jon01]. Given that the meaning of a source program is often derived from the effects that it invokes, it is particularly important that we review the techniques that Haskell uses to manifest impurity.

This chapter consists of two halves: a primer and a literature review. The primer presents reviews of the major approaches to defining the semantics of programs, the fundamentals of category theory as a formalism, and the usage of functors and monads (both category-theoretic constructs) in Haskell to implement side-effects. The intended audience for the primer

(especially as far as monads are concerned) is the functional programming community with prior experience in using monads to structure their programs, however the references provided throughout Chapter 3.4.1 serve as a rigorous introduction for the non-FP reader. The literature review that follows places this thesis in its wider context, discussing relevant work published on the various characterisations of computation, compilation and proving correctness, and defining programming constructs in a modular, extensible manner.

3.1 Semantics

When we talk about what a program 'does' or 'means', we are often referring to its *semantics*. There are multiple ways in which we can specify the underlying meaning of a program, and each has their appropriate use-cases. In this section we present the fundamentals of the two main approaches to defining the semantics of a program: *denotational* and *operational*.

3.1.1 Denotational Semantics

The denotational semantics of a language, as originally investigated by Scott and Strachey in the 1960s [SS71], is defined as a mapping from a program to a mathematical object which captures the essential meaning of

the program. We read $[\![\mathbf{x}]\!]$ as the *denotation* of program \mathbf{x} . Candidates for the set of denotations (the *semantic domain*) vary widely, but as a rule require the ability to differentiate between the 'amount' of information carried by a program [SHLG94]. In general, a denotational semantics should be *compositional*: that is, the meaning of a program phrase should only be constructed as a function of the meaning of its subphrases (however, as we shall see in Chapter 6, this need not always be the case!). To illustrate with an example – that uses Haskell syntax rather than Haskell itself, as we don't want anything infinite at this point – , consider the following simple language:

We can define a denotational semantics for Basic as follows, mapping into the set of integer values \mathbb{Z} :

In the above, the semantics of a Value constructor is simply the associated integer, and in turn the semantics of an Add is the sum of the denotations of the two argument expressions.

3.1.2 Operational Semantics

In contrast to the denotational approach of constructing a single interpretation function, a language can also be given an *operational semantics* by describing the syntax-directed behaviour of individual constructs of a language via *inference rules* which detail the desired transitions. An operational semantics can be given in one of two forms: either *structural* (or small-step, as developed by Plotkin [Plo81]), or *natural* (big-step, as developed by Kahn [Kah87]), and the key difference between these is whether a transition details a single computational step or a complete evaluation.

Recalling the Basic datatype introduced in the previous subsection, we define the rules for the structural operational and natural semantics for illustration. Note that we use the metavariables n_1, n_2, \ldots to range over integer values, (+) for integer addition, and a_1, a_2 over terms in Basic:

Structural Operational Semantics Rules

$$\overline{(\text{Value }n)\Rightarrow \text{Value }n} \ (S1)$$

$$\overline{\text{Add (Value }n) \ (\text{Value }m)\Rightarrow \text{Value }(n+m)} \ (S2)$$

$$\frac{a_1\Rightarrow a_1'}{\text{Add }a_1\ a_2\Rightarrow \text{Add }a_1'\ a_2} \ (S3)$$

$$\frac{a_2\Rightarrow a_2'}{\text{Add (Value }n)\ a_2\Rightarrow \text{Add (Value }n)\ a_2'} \ (S4)$$

Natural Semantics Rules

$$\frac{a_1 \Rightarrow \mathtt{Value} \; n_1 \quad a_2 \Rightarrow \mathtt{Value} \; n_2}{\mathtt{Add} \; a_1 \; a_2 \Rightarrow \mathtt{Value} \; (n_1 + n_2)} \; (N2)$$

Inference rules with no premisses (S1, S2 and N1) are referred to as axioms. We refer to the application of operational semantic rules to an expression as the execution of the expression [Hut10] (assuming that the application of existing operations such as integer addition is automatic), in contrast with its evaluation with respect to a denotational semantics. The implementation of an operational semantics is frequently referred to as a virtual machine, and we will see this term heavily used throughout this thesis.

3.2 Category Theory

Category theory is a mathematical tool used to capture the essence of interactions between mathematical objects with common structure [Pie91]. Within the scope of this thesis, being able to precisely describe generic structure of mathematical objects is important, and so we give a brief introduction to the key concepts within this section. Whilst there are several ways to characterise a category, here we define a *category* C to be:

- 1. A collection \mathbb{C}_{ob} of *objects*, denoted by metavariables $\mathbf{X}, \mathbf{Y}, \dots$
- 2. A collection \mathbb{C}_{ar} of *morphisms* between the objects of \mathbb{C}_{ob} (also sometimes called *arrows*). For example, $f: \mathbf{X} \to \mathbf{Y}$ is a morphism between objects \mathbf{X} and \mathbf{Y} , provided both objects are defined in the collection \mathbb{C}_{ob} . We denote morphisms with metavariables f, g, \ldots
- 3. A pair of functions dom and cod defined over morphisms from C_{ar}, detailing the domain and codomain of a given morphism (taking the view of morphisms as functions); e.g. given f : X → Y, then we have dom(f) = X, cod(f) = Y.

Furthermore, a category must adhere to the following:

- 1. For all objects \mathbb{C} , there is an associated morphism $id_{\mathbb{C}}: \mathbb{C} \to \mathbb{C}$.
- 2. For all morphisms $f: \mathbb{B} \to \mathbb{C}$, $id_{\mathbb{C}} \circ f = f = f \circ id_{\mathbb{B}}$.

- 3. For all morphisms f and g where the domain of g matches the codomain of f, there is an associated morphism $(g \circ f) : dom(f) \to cod(g)$.
- 4. For all morphisms f, g and h of the appropriate type, it must be the case that $(f \circ g) \circ h = f \circ (g \circ h)$.

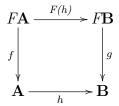
Categories can represent a vast array of mathematical structures, depending on the choice of \mathbb{C}_{ob} and \mathbb{C}_{ar} . For instance, the category **Grp** has groups as objects and group homomorphisms as morphisms, and the category **Set** has sets as objects and total functions as morphisms.

Further, in some categorical instances, particular objects can be denoted as being special in one way or another. We call an object $\mathbf{X} \in \mathbb{C}_{ob}$ initial if for all other objects $\mathbf{Y} \in \mathbb{C}_{ob}$, there is a unique morphism $i: \mathbf{X} \to \mathbf{Y}$. Similarly, we call \mathbf{X} terminal if there is a unique morphism $t: \mathbf{Y} \to \mathbf{X}$. For instance, within the category \mathbf{Set} , the empty set \emptyset is initial and any one element set $\{x\}$ is terminal; i.e. $i_{\mathbf{Set}}: \mathbb{C}_{ob} \to \emptyset$ and $t_{\mathbf{Set}}: \mathbb{C}_{ob} \to \{x\}$ $\forall x \in \mathbb{C}_{ob}$.

Adding further abstraction to this notion of common mathematical structure, the category \mathbf{Cat} can be constructed with (small) categories as objects and structure-preserving constructs known as *functors* as elements of \mathbb{C}_{ar} . Given two categories \mathbb{C} and \mathbb{D} , a functor F between them must obey the following conditions:

- 1. For all objects \mathbf{X} of the source category \mathbb{C} , there is a corresponding object $F(\mathbf{X})$ in the target category \mathbb{D} .
- 2. For all morphisms $f: \mathbf{X} \to \mathbf{Y}$ of the source category \mathbb{C} , there is a morphism $F(f): F(\mathbf{X}) \to F(\mathbf{Y})$ in the target category \mathbb{D} such that:
 - (a) For all objects **A** of the source category \mathbb{C} , $F(id_{\mathbf{A}}) = id_{F(\mathbf{A})}$.
 - (b) For all morphisms $f: \mathbf{X} \to \mathbf{Y}$ and $g: \mathbf{Y} \to \mathbf{Z}$ in the source category \mathbb{C} , there is a morphism $F(g \circ f) = F(g) \circ F(f)$ in the target category \mathbb{D} .

Given a functor $F: \mathbb{C} \to \mathbb{C}$ over a category \mathbb{C} (which we refer to as an endofunctor), we call a pair (\mathbf{A}, α) with an object $\mathbf{A} \in \mathbb{C}_{ob}$ and an arrow $\alpha: F\mathbf{A} \to \mathbf{A} \in \mathbb{C}_{ar}$ an F-algebra on F. In the category \mathbf{F} -Alg with F-algebras as objects, we define the morphism h between (\mathbf{A}, f) and (\mathbf{B}, g) as the morphism making the below diagram commute:



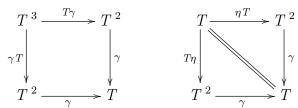
The most important definition we introduce in this section is that of a catamorphism. We define a catamorphism on f to be the unique morphism h between an initial algebra (\mathbf{A}, in) and any other F-algebra (\mathbf{B}, f) . This is also referred to as a functorial fold, and we will see it heavily used throughout the remainder of the thesis.

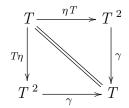
3.3 Computational Effects Using Monads

We have mentioned several times that it is tricky to manifest effectful computation in Haskell as a direct result of its purity. In this subsection, we show how the concept and usage of *monads* allows us to write programs that indirectly *simulate* effects (in that we avoid the need to painstakingly thread the appropriate data structures through a 'monad-free' program). More specifically, we give the categorical definition of monads as a specific type of augmented functor, show how this concept can be implemented in Haskell (and why the Haskell definition of monads uses a 'non-canonical' choice of methods), and how monads thus implemented can be used to define effectful language semantics.

3.3.1 Monads in Category Theory

Given a category \mathbb{C} , we define a monad on \mathbb{C} to be an endofunctor T that comes equipped with two 'morphisms between morphisms' (known as natural transformations), namely $\eta: 1_{\mathbb{C}} \to T$ (where $1_{\mathbb{C}}$ is the identity functor on \mathbb{C}) and $\gamma: T^2 \to T$. A monad thus equipped must meet the conditions laid out by the two diagrams below, with the underlying intuition given in Chapter 3.3.2:





3.3.2 Implementing Monads in Haskell

To reiterate, at this point we consider monads to be endofunctors augmented with two natural transformations which obey 'appropriate' laws [Mog89]. In order to understand the *implementation* of monads in Haskell [Wad92], we must first consider the implementation of functors.

Functors in Haskell

We have introduced functors as structure-preserving morphisms between the objects and morphisms of categories. In Haskell, the Functor typeclass captures this notion as follows:

class Functor f where

That is to say, an instance of a Haskell Functor is a type constructor f which can have its associated datatype mapped over via fmap. We require fmap to adhere to two laws:

- 1. $fmap \ id_{\mathbf{X}} = id_{f(\mathbf{X})}$
- 2. $fmap (g \circ f) = fmap g \circ fmap f$

By way of example, consider the following instantiation of a polymorphic binary tree as a Functor:

```
data Tree a = Leaf a | Node Tree Tree
instance Functor Tree where
fmap f (Leaf n) = Leaf (f n)
fmap f (Node l r) = Node (fmap f l) (fmap f r)
```

An intuitive view of a functor is that of a container, the contents of which can have functions applied to them. The shape of this container can vary widely, but the core functionality remains.

Introducing Monads

The categorical notion of monad can be represented in Haskell via the following datatype, with η renamed to return and γ to join:

```
class Functor m => Monad m where
  return :: a -> m a
  join :: m (m a) -> m a
```

The join method characterises what it means to 'be' a monad:

- 1. $join \circ fmap \ join = join \circ join$
- 2. $join \circ fmap return = join \circ return = id$
- 3. $join \circ fmap (fmap f) = fmap f \circ join$

However, prior to GHC 7.10 ¹, Haskell did not enforce the requirement that all monads are functors – disqualifying the usage of fmap –, using the following formulation instead:

class Monad m where

return :: a -> m a

(>>=) :: m a -> (a -> m b) -> m b

The above two definitions of monads are equivalent, with join and (>>=) being related by the following equations:

- 1. fmap $f \mathbf{m} = \mathbf{m} >>= (\mathtt{return} \circ f)$
- 2. join $\mathbf{n} = \mathbf{n} >= id$
- 3. $\mathbf{m} >= f \equiv \text{join} (\text{fmap } f \mathbf{m})$

¹The work within this thesis was developed using GHC 7.8.3.

The formulation in terms of return and (>>=) is the one that shall be used throughout this thesis. Moreover, we require that return and (>>=) adhere to the 'monad laws' of identity and associativity:

- 1. return $\mathbf{x} >>= f \equiv f \mathbf{x}$
- 2. $\mathbf{m} >> = \mathbf{return} \equiv \mathbf{m}$

3.
$$(\mathbf{m} >>= f) >>= g \equiv \mathbf{m} >>= (\lambda \mathbf{x} \rightarrow f \mathbf{x} >>= g)$$

For example, the Maybe datatype can be instantiated as a monad which is used to model exceptions:

instance Monad Maybe where

$$return x = Just x$$

Nothing >>= f = Nothing

Just
$$x \gg f = f x$$

Monadic Semantics

As we shall see shortly, Moggi's original 1989 paper [Mog89] utilised monads in order to structure denotational semantics, and Wadler expanded on this idea to produce modular interpreters in 1992 [Wad92]. Liang and Hudak

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continued this line of work, developing the notion of modular monadic semantics in 1998 as a *structured* denotational semantics, revolving around monads and monad transformers as the key descriptive mechanism [Lia98].

As we have seen, a monad in Haskell is a type constructor **m** with methods:

```
return :: a -> m a (>>=) :: m a -> (a -> m b) -> m b
```

Using these methods, it can be shown that a language can be given a denotational semantics that is parameterised by a monad encapsulating the result type. The modular monadic semantics for a language L supporting addition can be given in the following way:

Depending on the choice of monad m, the concrete semantics that result may differ, hence the usage of the term 'modular' in this context. For example, observe the return and (>>=) definitions for the monads representing state and environment respectively:

```
type m a = \s -> (a, s) -- Mutable State

return x = \s -> (x, s)

x >>= f = \s -> let (u, t) = x s in (f u) t

type m a = Env -> a -- Environment

return x = \e -> x

x >>= f = \e -> f (x e) e
```

With this style of language specification, those features (i.e. data constructors) of a language which do not require the abstraction required by a monad are simply 'lifted' into one by way of return and (>>=), whilst those that do require the monad are free to make full usage of any operations that its presence enables, a concept which we will explore fully in Chapter 4.

3.4 Associated Literature

In this section, we present a survey of the existing work that is most relevant to our work on the modular compilation of effects. These papers have been loosely grouped into subcategories to maintain coherence, and is current as of December 2014. For each paper, the major contributions are introduced and any particularly interesting or relevant concepts are explained.

3.4.1 Monads As Computation

In this section, we examine the work credited with both identifying and popularising the idea of modelling computational effects using monads within both the category theory and functional programming communities.

Computational Lambda-Calculus and Monads, Eugenio Moggi (1989) [Mog89]: Moggi's 1989 paper was the first to investigate the idea that effectful computation can be modelled using category theory. The primary notion is that a program can be seen as a morphism between an object \mathbf{A} of values of type \mathbf{A} and an object \mathbf{T} \mathbf{B} of computations of type \mathbf{B} , where \mathbf{T} is a monad which captures the side-effects that the computation may contain. This type of morphism belongs to the Kleisli category $\mathbb{C}_{\mathbf{T}}$ constructed from a base category \mathbb{C} , with identity and composition morphisms given by the natural transformations associated with \mathbf{T} as defined in Chapter 3.2. For example, in the category \mathbf{Set} , the monad $\mathbf{T}_{\mathbf{ND}}$ for nondeterminism is defined with \mathbf{T} $\mathbf{A} = \mathcal{P}(\mathbf{A})$, $\eta_{\mathbf{A}}(\mathbf{a}) = \{\mathbf{a}\}$ and $\gamma_{\mathbf{A}}(\mathbf{X}) = \cup \mathbf{X}$.

The paper goes on to discuss the interpretation of simple computations within Kleisli categories, and the conditions which must be met to extend the set of terms which can be interpreted. For example, to interpret lambdaterms the underlying monad must be extended to a strong monad via an additional natural transformation. The main contribution of the paper is the concept of $\lambda_c - models$ over a category $\mathbb C$ (where such a model is a strong

monad with T-exponentials) and the formal system λ_c – the *computational* lambda calculus – which is sound and complete over λ_c -models, capable of establishing the categorical equivalence of terms written within it.

The Essence of Functional Programming, Philip Wadler (1992)

[Wad92]: Following Moggi's discovery that effectful computation can be modelled using monads, Wadler began to investigate the application of monads to structure functional programs. The paper begins by discussing the changes that an interpreter written in a pure functional language would require to support a number of effects, and contrasts these changes to the fact that an impure interpreter would need no such restructuring. Following on from this, an interpreter for a language Term based upon the lambdacalculus is introduced in Haskell, and the functional characterisation of monads is established. It is then shown how the 'standard' interpreter is extended in order to support individual additional features, ranging from exception handling to nondeterminism. For each extension, the underlying monad M and associated methods unitM and bindM are redefined to support the feature in question, and the parts of the interpreter that are associated with the feature identified and changed appropriately. Further, the changes which need to be made to the interpreter such that it uses the call-by-name evaluation scheme – instead of call-by-value – are discussed in depth.

At this point, the monad laws are introduced, and it is discussed how the laws can alternatively be formulated using unitM and the monadic operations mapM and joinM, and that these two sets of laws necessarily follow from each other. The laws are then used to prove that binary addition is associative in *any* monadic interpreter.

The paper goes on to contrast the monadic style of programming used in the interpreter and its extensions to continuation-passing style (CPS). To this end, the continuation monad is introduced and used to structure the interpreter for the *original* Term language: it is observed that the resulting interpreter is similar to that which utilised the identity monad. Indeed, it is recognised that a suitable monad allows a monadic interpreter to be translated into a CPS interpreter – and vice-versa – by choosing a suitable answer space. However, there *is* a difference between monads and CPS concerning the degree of 'control' allowed in a datatype: for example, CPS cannot provide an 'error escape' for a language with exceptions.

Finally, it is noted that some syntactic sugar may go some way to aiding the comprehension of programs written in a monadic style – a 'letM' construct for a monad M is proposed –, an observation eventually realised in the form of **do**-notation.

Monads For Functional Programming, Philip Wadler (1992) [Wad95]: Building upon the work described in the previous paper, this paper identifies further application areas for monads within functional programs. The first half of the paper re-introduces the 'monadification' of an interpreter

extended with various features. This version differs, however, in that the full non-monadic definition of the interpreter for each feature is given first, pointing out the common structure of each variation before generalising this pattern and revisiting each feature, defining its monadic counterpart. This approach makes explicit the benefit that the monadic style provides when function redefinition is required. For each feature, a number of sample expressions are evaluated to clarify the interpreter semantics, a notable omission from the original paper.

It is then observed that whilst the use of monads so far has been limited to describing existing features more effectively, they can also be used to aid in the definition of new features. To demonstrate, the following two sections treat (respectively) the implementation of an efficient in-place array update and the use of monads to construct recursive descent parsers. In the former, monads of state transformers are introduced as a way to transform and read arrays, with the fact that monads are represented as abstract datatypes ensuring the single-threadedness of the array (a crucial condition for updating an array safely). The latter identifies that parsers themselves form a monad, and concepts such as sequencing, alternation, filtering and iteration of such monadic parsers are defined and discussed.

3.4.2 Alternative Characterisations Of Computation

Whilst this thesis is heavily reliant on Haskell's use of monads and monad transformers to model computational effects, these are not the only techniques available. In this section we survey papers which seek to provide alternate characterisations of effectful computation.

Computational Effects & Operations: An Overview, Gordon Plotkin and John Power (2002) [PP04]: The commonly held view of operations associated with computational effects (i.e. inEnv, callcc etc) is that they are derived from an underlying monad T. However, there is a diametric view wherein the operations themselves are taken as primitive, and a monad is derived using the operations as constraints. This latter approach is referred to as the algebraic theory of effects, and makes use of Lawvere theories: collections of all equations that hold for a particular algebraic structure. More specifically, countable Lawvere theories are used, meaning that the operations and equations comprising the theory form a countable set.

The main notion of this paper is that a description of an effect can be given as a countable Lawvere theory freely generated by its associated algebraic operations [PP01], with a correspondence existing between the theory's morphisms and said operations. A number of examples are given in the paper, including nondeterminism and partiality, amongst others. We note that whilst commutative *product* Lawvere theories can be constructed from

subtheories subject to adherence to commutativity laws (which would allow for arbitrary orderings of effects: more on this in Chapter 5.3.1), Haskell cannot enforce these laws at present (under GHC 7.8.4).

Handlers of Algebraic Effects, Gordon Plotkin and Matija Pretnar (2009) [PP09]: In a sense, the algebraic operations which characterise an effect can be seen as dual to the concept of computational effect handlers: the former can be viewed as constructors for an effect, and the latter as deconstructors that manifest an effect. Moreover, common constructs such as exception handlers are not algebraic operations [PP03]. This paper introduces the notion of a handler construct for arbitrary algebraic operations, and shows how a generalisation of the exception-handling construct of Benton and Kennedy [BK01] permits an algebraic treatment.

The underlying concept is that the handling of a computation corresponds to a homomorphism (a structure-preserving map), the domain of which is generated by the algebraic theory of the effects involved. The paper presents a logic for the handling of algebraic effects and a call-by-push-value calculus [PP08, Lev06] to formalise the ideas presented throughout.

Programming and Reasoning with Algebraic Effects and Dependent Types, Edwin Brady (2013) [Bra]: The previous paper presents formalisms which underpin the work on constructing handlers for algebraic effects, however these formalisms are defined over sets and functions, with

the understanding that the concepts generalise in a straightforward manner to richer domains. This paper explicitly demonstrates this claim, implementing the handlers of algebraic effects within the general-purpose, dependently-typed functional programming language Idris [Bra13].

The notion of algebraic effects is implemented as a domain specific language (DSL) called Effects. This DSL makes use of the dependent types available in Idris in two essential ways: firstly by implementing a type-level check that the effect which we are invoking a handler for is indeed present in a source program, and secondly keeping relevant resources (data associated with effects) up-to-date throughout the lifetime of a program.

3.4.3 Compilation & Correctness

In this section we survey a selection of papers associated with both the techniques utilised in the compilation of languages and methods of proving such compilation techniques to be semantically correct. We acknowledge at this point that the term 'modular compiler' can mean a great many things, with the axes upon which measures of modularity are obtained differing from one paper to the next. We point out such differences where they arise throughout.

Monad Transformers And Modular Interpreters, Sheng Liang, Paul Hudak and Mark Jones (1995) [LHJ95a]: This paper is considered the

genesis of the usage of the monad transformer technique within Haskell, focussing upon the notion of using composable building blocks corresponding to individual computational features to form programming language interpreters. The data constructors and supported operations expected of a number of effects are introduced, alongside the monad transformers needed to implement them.

The source languages which result from this modularised approach are represented as a domain sum (implemented using an OR operator). The main interpreter function is defined as a method of a constructor class, which each sublanguage must be an instance of. What follows is a thorough discussion of the complications which arise when lifting certain monad transformers—more precisely, their operations—through each other. Two monad transformer laws detailing the conditions which the transformer method lift must satisfy, and the concept of a natural lifting of operations along a monad transformer is introduced. A natural lifting enforces the implicit constraint that a program not utilising a certain language feature behaves in the same manner if that feature is removed.

It is observed that if – categorically – a monad cannot compose with *all* other monads, a monad transformer variant cannot be defined for the feature it models. For example, the list monad can only compose with *commutative* monads, as discovered by Jones and Duponcheel [JD93]. As such, there is no monad transformer modelling nondeterminism. Due to this, we

must often define a base monad to which transformers are applied. The paper goes on to discuss how certain monad transformers can be implemented by others: the examples given include environments modelled using the state monad transformer, and exceptions modelled using the continuation transformer. To conclude, a number of 'difficult' liftings – in the sense that the resulting semantics may be unclear – are given.

Modular Compilers Based On Monad Transformers, William L. Harrison and Samuel Kamin (1998) [HK98a]: Extending the work described above on using monad transformers to develop modular interpreters, this paper seeks to apply the same techniques to compiler construction. Such a compiler is constructed via a combination of compiler blocks, where a single compiler block is defined by the equations defining the 'compilation semantics' of an effect, and the monad transformers – and associated methods – needed to implement the effect. Given the monadic, CPS semantics of a feature, its compilation semantics are obtained via pass separation, the introduction of intermediate data structures with monad transformers.

The main result of the paper is the construction of a modular compiler for an Algol-like imperative language. The target language is a machine-language represented using appropriate combinators (popblock, push etc), an approach which takes advantage of the monadic structure of compilation semantics. Separate to this final result, the compilation of two languages supporting simple expressions and control flow is demonstrated, followed by

their combination. The paper concludes by discussing a number of issues which may arise, such as metavariable scoping and recursion.

Compilation as Metacomputation: Binding Time Separation in Modular Compilers, William L. Harrison and Samuel Kamin (1998) [HK98b]: This paper builds upon the authors' previous work by observing that metacomputations (computations which produce computations) arise naturally in the compilation process. Compiler metacomputations can be obtained by compiling the static aspects of a program – such as code generation – into a computation which contains the dynamic aspects, i.e. stack manipulation. This staging of a program can be implemented using two monads – a static and dynamic monad – constructed via monad transformer. It is claimed that the composition of these two monads gives the correct domain for a modular compiler utilising staging.

Several of the compiler blocks from the previous paper are re-introduced, and the structure of the metacomputations produced by each is given. In each instance, the staging monads Comp and Exec are described via the operations which must be supported, and therefore which monad transformers must be used to construct them. The construction of these staging monads using transformers simplifies the combination of building blocks. Given the staging monads for any two compiler blocks, the staging monads for their combination are constructed using each of the monad transformers associated with the originals. Presuming that the specification of two languages

are described by sets of equations, the specification of their combination is simply their set union.

Modular Compilers and their Correctness Proofs, William L. Harrison (2001) [Har01]: Harrison's doctoral thesis focusses the problem of modular compilation in the sense discussed by the previous two papers, via the construction and verification of reusable compiler building blocks (RCBBs) for various features of a source language. Demonstrations – and implementations – of the compilation of programs supporting various combinations are given, including static/dynamic scoping of variables, control flow and imperative features. Two distinct approaches to developing RCBBs are proposed, namely as metacomputations – defined previously – and as monadic code generators, with the same target language as considered in his prior work [HK98a].

The examples and discussion relating to the metacomputational approach correspond strongly with that in the previous paper, mainly concerning theorems relating the standard and compilation semantics of languages. The alternative approach – compilation using monadic code generators (MCGs) – defines an MCG as a function compile :: Source \rightarrow m Target for each feature, parameterised over a monad m – this approach being more closely related to that of our own research. The same features used as examples for the metacomputational approach are reused here, with MCGs for each introduced and explained in detail. The thesis then presents a

case study of a source language Exp supporting exceptions, imperative features, blocks, booleans and control flow structure. The compiler for this language is verified correct by formulating and proving relations between the standard and compilation semantics of metacomputations and MCGs.

Certain conditions must be met in order to combine blocks to form a compiler for a non-trivial language, called *linking conditions*. The two linking conditions illustrated in the thesis relate imperative features to expressions, and control flow to booleans. To conclude, the notion of *observational program specification* is developed, a parametric monadic specification making minimal assumptions about the monad associated to a MCG, which proves useful in the verification process described.

Compiling Exceptions Correctly, Graham Hutton and Joel Wright (2004) [HW04]: Surprisingly, despite the amount of research into compilers within functional programming, correctness proofs for compilers dealing with non-standard features have been slow to emerge. To this end, this paper seeks to address this issue for exceptions, traditionally viewed as an advanced topic in compilation theory. The paper opens with the Haskell definition of a small language Expr consisting of integer values and addition, alongside an evaluator, compiler (targeting a stack-based list of instructions as the IR, as will be seen throughout this thesis) and virtual machine operating over it. The conditions for correctness are stated and proved for a

general stack via induction, alongside a lemma detailing how code can be split up and executed in steps without affecting the result.

Expr is then extended with constructors enabling simple notions of exception throwing and handling, alongside extensions to the datatypes representing code. As a result, the evaluator, compiler and virtual machine are extended with new function definitions and edited where necessary to reflect the new semantics. A second proof of generalised compiler correctness relating to this extended language is given. Finally, in order to bring results more in line with 'realistic' languages, Expr is altered to include label jumps, and – instead of marking a stack with compiler handler code – makes reference to address locations. This final compiler is proved correct via a number of inductively proved lemmas concerning issues such as the monotonicity of address allocation.

Compiling Concurrency Correctly: Cutting Out The Middle Man, Liyang Hu and Graham Hutton (2010) [HH09]: Traditionally, compiler correctness for concurrent languages is proved by translating from both the source and target languages into an intermediate π -calculus (a formal system giving semantics to concurrent computations) and then proving equivalence via bisimulation. However, this method is overly complicated, requiring several extra layers of formalism, and this paper describes a simpler technique. Taking the same approach as the previous paper discussed, a language Zap of integer values and addition is defined, and – using Agda –

given an operational semantics involving *actions* and *labels* which permits a simple notion of nondeterminism.

As nondeterminism introduces the possibility of *sets* of result values, the semantics of the compiler and virtual machine are given as a relation – rather than a set-valued function – coupled with a notion of weak bisimilarity (ignoring silent actions). The compiler correctness statement for Zap is formulated in terms of weak bisimilarity between two *combined semantics* expressions – the pairing of a Zap expression and a virtual machine – and proved in Agda. It has since been observed that this theorem captures precisely the same notion of compiler correctness as that of the compiler for exceptions discussed in the previous paper.

The Zap language is then extended to support explicit concurrency by forking expressions into new threads, resulting in the language Fork. The compiler is extended, new actions and labels are introduced, and the notion of a 'thread soup' as a list of concurrent threads is formalised. Finally, Fork is proved correct in a general setting using Agda.

A Formally Verified Compiler Back-End, Xavier Leroy (2009) [Ler09]:

A large portion of the literature regarding compiler correctness considers
a variation on the lambda calculus as the choice of source language. However, compiler correctness is possible for languages capable of producing

critical software, as demonstrated by Leroy in this journal paper. Taking a significant subset of the C language (Cminor) as the source language, and targeting PowerPC assembly code, a Coq-verified compiler Compcert is presented. It is observed that the semantic preservation property of a compiler can be established by proving the forward simulation for safe programs property, which states that both the source and target programs produce the same 'set' of observable behaviours, with no behaviour classified as being 'incorrect'. We also require that the target language is deterministic, but since Compcert targets assembly code – deterministic by design –, only the forward simulation property requires attention.

The paper then discusses each stage of the compilation process using Competr in detail. Each stage performs a different task, beginning with converting a source program from Cminor – for which a full semantics is given – to CminorSel, a language making use of a processor-specific set of operators. Further stages address issues such as light optimisations (e.g. constant propagations) and register allocation. At each stage, semantic preservation is proved, and detailed semantics of intermediate languages (of which there are several) are given. The possibility of retargeting Competr is also discussed, and shown to be possible by retargeting the ARM instruction set.

First-Class Syntax, Semantics, and their Composition, Marcos Viera

(2012) [Vie12]: When describing extensible programming languages, a frequently used technique is that of attribute grammars, a formalism proscribing attributes to grammar productions, producing an abstract syntax tree with attribute information in the nodes [Joh87]. These attributes can be either inherited (passed down a tree, such as environments), or synthesised (passed up a tree, such as previously computed results). Viera's PhD thesis shows how a programming language can be implemented by composing attribute grammar fragments corresponding to individual aspects of the desired language, with the type system of the implementation language – Haskell – guaranteeing that conflicting compositions are not permitted. Parsers for these languages can be constructed on-the-fly in a similar manner. Throughout, it is shown how a compiler can be incrementally constructed for the imperative language Oberono [Mö93].

3.4.4 Modular Semantics

In this section, we survey papers which develop techniques which allow for a greater degree of control in language definition and effectful computation.

Modular Denotational Semantics for Compiler Construction, Sheng Liang and Paul Hudak (1996) [LH96]: Extending the author's previous work introducing monad transformers [LHJ95b], this paper aims to derive compilers from modular interpreters which are based on modular monadic

semantics. Firstly, examples are given defining the standard semantics of a number of language features in terms of effectful operations, referred to here as *primitive monadic combinators*.

It is observed that since a modular monadic semantics is no more than a structured denotational semantics, the monad laws described earlier can be used to β -reduce – and optimise – source programs. However, it is noted that program fragments utilising primitive monadic combinators such as in Env cannot be β -reduced as they do not feature in the monad laws. To overcome this issue, the environment monad is axiomatised via four laws (e.g. inner environments supercede outer environments) and these are used to further simplify programs.

Lifting of Operations in Modular Operational Semantics, Mauro Jaskelioff (2009) [Jas09]: Jaskelioff's doctoral thesis addresses the lifting of operations through monad transformers in a uniform manner. The thesis begins by explaining why this is necessary, identifying a number of issues with the current monad transformer framework of Haskell [Gil14], such as the shadowing of operations wherein two applications of the same monad transformer result in one transformer being inaccessible.

Operations are defined to be mappings on the category of monoidal categories, and classified as either *H-algebraic*, first-order or algebraic depending on their structure. It is then demonstrated how several examples of such operations can be lifted in a canonical manner, and where several such liftings are possible, that they coincide. Key to this is the classification of a monad transformer as being *monoidal*, *functorial* or *covariant* (or potentially none of these).

The theory developed is then implemented in Haskell in the form of the *Monatron* library [Jas11]. Monatron differs from the *mtl* library in that it distinguishes between multiple classes of monad transformer. Detailed examples are given, most notably for the exceptions monad. Here, the associated methods throw and handle are separated and lifted using the appropriate techniques for their algebraic class. Monatron is used extensively throughout the final two chapters, firstly in developing a modular interpreter for a language supporting processes, conditional arithmetic and exceptions using the à la carte technique, and secondly in implementing a modular operational semantics based upon work by Turi [TP97].

Semantic Lego, David Espinosa (1995) [Esp95]: Espinosa's doctoral thesis presents Semantic Lego (SL), a "language for describing languages" – implemented in Scheme – designed to build interpreters from component specifications. The theory of stratification (splitting a monad into 'levels') is introduced: for example, the monad $T_1(A) = S \rightarrow A \times S$ is considered to be on a higher level than $T_2(A) = A \times S$ due to the extra argument of type S. Stratified levels can then be combined using stratified monad transformers, classified as either top, bottom or around transformers according

to their structure. Two examples are the bottom exception transformer F(T)(A) = T(A + X), and the top environment transformer $F(T)(A) = Env \rightarrow T(A)$.

SL divides a language semantics into two parts, a computation ADT and a language ADT. The former represents the actual semantics, the latter grammatical syntax, and it is the former which is implemented using stratification. An SL interpreter for a Scheme-like language is developed, with examples of the resulting semantics when considering the various orderings of nondeterminism and continuations.

A Modular Monadic Action Semantics, Keith Wansborough and John Hamer (1997) [WH97]: Action semantics [Mos96] and modular monadic semantics (MMS) [Lia98] are two existing approaches to defining semantics in a modular manner. These two semantic approaches differ in their underlying formalisms, and both styles suffer from issues regarding extensibility and accessibility: an action semantics cannot easily be extended to describe new features, and MMS uses syntax which can be confusing to the layman. This paper proposes merging the best of both styles, resulting in modular monadic action semantics (MMAS): an action semantics wherein combinators are described via MMS as opposed to SOS.

This change enables the extensibility that action semantics lacks: if a feature cannot be described with action notation (e.g. continuations) then we implement that feature via MMS instead. As MMS is itself no more than a structured denotational semantics, the usual methods for reasoning about programs – e.g. β -reduction – therefore apply. However, unaddressed issues remain: the underlying type-class system is that of Haskell, rather than the unified algebra foundations underpinning action semantics [Mos89], and some operations have their semantics altered as a result - for example, MMAS provides a 'lesser' implementation of non-deterministic choice than its action semantic counterpart.

3.4.5 Extensible Constructs

In this final section of our literature review, we present related work on the topic of defining programming language constructs in a manner that – by construction – renders them easy to extend.

Monads, Zippers and Views: Virtualising the Monad Stack, Tom Schrijvers and Bruno C. D. S. Oliveira (2011) [SO11]: As we have observed, a number of problems exist when lifting operations through a concrete monad stack. One problem we have not yet mentioned is that modifying the stack may result in the need to alter existing code to ensure that invocations to the lift operation refer to the correct transformers. This paper describes two techniques for 'virtualising' a monad which has been constructed using transformers: namely, the notions of monad zippers and

monad views, which generalise to create structural and nominal masks. A monad zipper is a transformer which ignores a prefix of a monad stack using operations \uparrow – a 'lift' of sorts – and \downarrow , an inverse which has no typical equivalent. These operations allow methods associated with a monad transformer to be called without using lift to bypass other instances of the same transformer. A monad view is a monad morphism which allows for different versions of the monad stack to be presented to distinct parts of a computation.

Together, these notions permit the construction of a masking language which allows parts of a monad stack to either be hidden or have their access restricted at a point of usage. Structural masks are defined using primitives \square and \blacksquare . To demonstrate, the mask (\square ::: \blacksquare ::: \square) hides the second layer of the monad stack. Using different combinations of structural masks, several permutations of a single concrete stack can be presented when needed, eliminating the need for lifting. Nominal masks, in contrast, 'tag' each layer of a monad stack with a singleton type, distinguishing between multiple instances of transformers without the usage of lift.

Datatypes à la Carte, Wouter Swierstra (2008) [Swi08]: this paper describes a solution to the 'expression problem' [Wad98] – described in Chapter 2 – and forms a crucial part of the foundations for this thesis, and will be explored in depth in Chapter 4 – using techniques for constructing datatypes and functions in a modular manner by combining several

previously known results. The leading example is an evaluation function over a simple language consisting of integers and addition. The core idea is that a datatype can be represented as the least fixpoint of a coproduct of functors – which represent constructor signatures –, and functions over such datatypes can be represented as categorical algebras.

Following a discussion of how certain well known monads (e.g. identity and Maybe) are free monads – essentially trees parameterised over a functor –, the paper demonstrates how both the state monad and certain aspects of the IO monad can be emulated in the à la carte style by implementing a simple calculator with memory for storing and recalling values.

Open Data Types and Open Functions, Andres Loh and Ralf Hinze (2006) [LH06]: This paper presents an alternative approach to solving the expression problem in Haskell, with the key mechanism being that of a novel syntactic extension to Haskell, in contrast to the à la carte technique which makes use of existing language features and compiler pragmas. In this approach, datatypes and functions that we may yet extend with new constructors or patterns are flagged with the open keyword. Extensions to either functions or datatypes can then be included anywhere in a source program, not just at the point of definition, with the final definitions grouped together at compile-time by a Haskell preprocessor.

One consequence of the fact that open functions can have their patterns

dispersed throughout a source program is that the usual first-fit approach that Haskell takes to pattern matching is no longer appropriate. For example, if the default case for an open function appears at the top of a source file, the function is effectively closed, with no other definitions reachable. In response to this, open functions make use of best-fit left-to-right pattern matching instead (in which the most specific match is the one chosen, with wildcards less specific than explicit metavariables etc), rendering the order in which open function definitions appear irrelevant.

Parametric Compositional Datatypes, Patrick Bahr and Tom Hvitved (2011): The aforementioned datatypes à la carte technique presents a particularly elegant solution to the expression problem in Haskell. However, the insights it reveals are of limited applicability outside the setting of the problem itself. Previous work by the authors of this paper [BH11] has sought to extend the à la carte approach in the form of compositional datatypes (CDTs). The CDT framework supports wider functionality for recursion and mutually recursive datatypes. However, CDTs cannot implement variable bindings due to issues concerning α -equivalence.

This issue is resolved by merging the à la carte technique with a parameterised variant of higher order abstract syntax (HOAS). HOAS represents variable bindings in a source language by using the binding mechanism of the metalanguage. However, this combination of methods cannot support recursion over abstract syntax trees, as data constructors which are

defined in this way are not functors. The solution posed by this paper involves changing the signature representation to that of difunctors [MH95], and altering the structure of terms to that of a free monad. This combination of compositional datatypes and HOAS forms a technique referred to as parametric compositional datatypes (PCDTs).

The paper shoes how monadic computations can be implemented using both CDTs and PCDTs, before discussing $term\ algebras$ – algebras defined with carrier Fix f for some signature f – and $term\ homomorphisms$, functions of type \forall a. f a \rightarrow Context g a for some free monad Context. It is then demonstrated how these algebras and homomorphisms can compose, and concludes by introducing monadic term homomorphisms and shows how mutually recursive datatypes and generalised algebraic datatypes can be constructed using PCDTs.

Extensible Effects: An Alternative to Monad Transformers, Oleg Kiselyov (2013) [KSS13]: The monad transformer framework is not without its issues, as we have alluded to when discussing the work of Jaskelioff above and will explore in detail in Chapter 5. An alternative approach developed around the time that monad transformers were introduced is that of extensible denotational language specifications (EDLS) [CF94], wherein an effect is viewed as a request to an external, inflexible 'authority' which interprets the request and either permits it and returns an appropriate continuation, or declines and aborts. This paper by Kiselyov improves

upon both the monad transformer and EDLS approaches by introducing an extensible 'bureaucracy' as part of the user program which consists of partial authorities (which correspond to algebraic handlers) that can either execute a request for pass the request to the appropriate authority. In conjunction with this, a type-and-effect system is introduced as an open union of effects: a handler will remove its associated effect from the union during execution in order to both accurately track the current state of a program, and guarantee that no 'dangling effects' exist in a program.

3.5 Justifying This Thesis' Position

TODO: COMPLETE THIS

– discussed monads quite heavily – despite alternatives to monads, still the most well-understood/mainstream way to simulate effects [vs handler-s/algebraic theories] – monads appear in several semantic models, so we won't be working with tools that are 'ill-defined' in nature – we choose to parameterise over the datatype itself via datatypes a la carte [but why!?] – demonstrating the stack based representation of IR just for clarity rather than anything more complex [like RTL], however there's work done on, for example, modular Hoopl – continuing the work on splitting a compiler into

small, isolatable pieces in the style of Hutton, with the future goal of individual correctness proofs – open datatypes are promising advances, and once open datatypes become available in GHC it'll be fun to tinker with.

Chapter 4

Modular Compilers:

Initial Steps

Now that we are familiar with the problem domain, we can begin to put together an initial framework that allows for the specification of compilation schemes between tree-based source languages and stack-based target languages, with each such scheme independent to the others by design. In this chapter, we will discuss how this can be done in Haskell by exploiting the typeclass system, and also how functors — as a core example of the typeclass system in action — allow for language syntax to be defined in a modular manner. We begin this chapter, however, with a discussion of how Haskell makes use of *multiple* side-effects within a single monad.

4.1 Modular Effects

In the previous chapter, we saw an example of the concept of computational effects being modelled using monads. Whilst each monad normally corresponds to a single effect, since most languages support more than one effect the issue of how to combine monads quickly arises. In this section, we briefly review the approach based upon *monad transformers* [LHJ95b].

4.1.1 Monad Transformers in Haskell

In Haskell, monad transformers have the following definition:

```
class (Monad m, Monad (t m)) => MonadT t where
  lift :: m a -> t m a
```

Intuitively, a monad transformer is a type constructor t which, when applied to a monad m, produces a *new* monad (t m). Monad transformers are required to satisfy two laws:

```
1. lift \circ return<sub>M</sub> = return<sub>(T M)</sub>
```

2. lift
$$(\mathbf{m} >>= \mathbf{k}) = \text{lift } \mathbf{m} >>= (\text{lift } \circ \mathbf{k})$$

The lift operation associated with every monad transformer is used to convert values in the base monad m to the new monad (t m). By way

of example, the following table summarises five common computational effects, their monad transformer types, and corresponding implementations:

Effect	Transformer Type	Implementation
Exceptions	ErrorT m a	m (Maybe a)
State	StateT s m a	$\mathtt{s}\rightarrow\mathtt{m}(\mathtt{a},\mathtt{s})$
Environment	ReaderT r m a	extstyle ext
Logging	WriterT w m a	m (a, w)
Continuations	ContT r m a	$(a \rightarrow m r) \rightarrow m r$

The general strategy is to 'stratify' the required effects, by starting with a base monad – often the Identity monad – and applying the appropriate transformers. There are some constraints regarding the ordering; for example, certain effects can only occur at the innermost level and certain effects do not commute [LHJ95b] (topics which we discuss in detail in Chapter 5.3.1), but otherwise effects can be ordered in different ways to reflect different intended interactions between the features of the language.

To demonstrate the concept of monad transformers, we will examine the transformer for exceptions in more detail. Firstly, its type constructor is declared in the following manner:

newtype ErrorT m a = E { runE :: m (Maybe a) }

Note that (ErrorT Identity) is equivalent to the Maybe monad. We can now declare ErrorT as a member of both the Monad and MonadT classes:

instance MonadT ErrorT where

```
lift m = E \ m >>= \v -> return (Just v)
```

In addition to the general monadic operations, we would also like access to other primitive operations related to the particular effect that we are implementing. In this case, we would like to be able to throw and catch exceptions, and we can enable this by having the relevant operations defined as methods of an *error monad class*:

```
class Monad m => ErrorMonad m where
  throw :: m a
```

catch :: m a -> m a -> m a

We instantiate ErrorT as a member of this class as follows:

More importantly, we can also declare monad transformers to be members of effect classes *other* than their own. Indeed, this is the primary purpose of the lift operation. For example, consider the state monad transformer:

```
newtype StateT s m a = S { runS :: s -> m (a, s) }
instance Monad m => Monad (StateT s m) where
return x = S $ \s -> return (x, s)
(S g) >>= f = S $ \s -> do (x, t) <- g s
runS (f x) t</pre>
```

We can extend StateT such that it supports exception handling by instantiating it as a member of the error monad class as follows:

```
instance ErrorMonad m => ErrorMonad (StateT s m) where
throw = lift . throw
x 'catch' h = S $ \s -> runS x s 'catch' runS h s
```

In this manner, a monad that is constructed from a 'base' monad using a number of transformers comes equipped with the associated operations for all of the constituent effects with necessary liftings handled automatically, with the caveat that they have to be manually implemented for any combinations one wishes to use, which can lead to boilerplate.

4.1.2 Monad Transformers Categorically

The foundations on which Haskell is built dictate that the notion of monad that we have described above is not quite its categorical equivalent, but rather a *strong* monad [Mog89]. For the sake of completeness, we will address the core categorical definitions involved in this subsection.

To do so, we must first introduce the notion of a monoidal category. A category \mathbb{C} is monoidal if it is equipped with a notion of tensor product; that is to say, an associative bifunctor (that is, a functor taking two arguments) $\zeta: \mathbb{C} \times \mathbb{C} \to \mathbb{C}$ that has a unique object $\mathbb{I} \in \mathbb{C}_{ob}$, which acts as both a right and left identity.

A monad (T, η, γ) within such a monoidal category is *strong* if it is equipped with a natural transformation $t_{\mathbf{A}, \mathbf{B}} : \zeta(\mathbf{A} \times T\mathbf{B}) \to T(\zeta(\mathbf{A} \times \mathbf{B}))$.

Finally, given categories \mathbb{C} and \mathbb{D} , an *adjunction* between them consists of:

- 1. A left adjoint functor $F : \mathbb{C} \leftarrow \mathbb{D}$.
- 2. A right adjoint functor $G : \mathbb{C} \to \mathbb{D}$.
- 3. A natural transformation $\phi: hom_{\mathbb{C}}(\mathtt{F}-,-) \to hom_{\mathbb{D}}(-,\mathtt{G}-)$
- 4. A counit natural transformation $\epsilon : FG \to 1_{\mathbb{C}}$
- 5. A unit natural transformation $\eta: 1_{\mathbb{D}} \to \mathsf{GF}$

The natural transformation ϕ is defined in terms of *hom-sets*. More specifically, $hom_{\mathbb{C}}(X,Y)$ is the collection of morphisms between $X, Y \in \mathbb{C}_{ob}$.

Less formally, an adjunction can be described as a relationship between constructs. For instance, monads are adjunctions over categories. More importantly, the majority of the monad transformers which we utilise throughout this thesis – state, exceptions, writer and reader – can be shown to be adjunctions over monads themselves [Wad12].

We provide the information above out of a belief that having formal definitions for commonplace constructs is never a bad thing. However, to keep the remainder of the thesis accessible to those outside of category theory, we do not make further use of the concepts discussed herein.

4.2 Modular Syntax & Semantics

The previous chapter made the observation that adding extra constructors to a datatype often requires the modification of existing code. In this section, we will first review the modular approach to datatypes and functions put forward by Swierstra [Swi08], known as the *datatypes* à *la carte* technique, and show how it can be used to obtain modular syntax and semantics for our simple expression language.

4.2.1 Datatypes À La Carte

The underlying structure of an algebraic datatype in Haskell – such as Expr from Chapter 2.1 – can be captured by a constructor signature. We can define distinct *signature functors* for the arithmetic and exceptional components of the Expr datatype as follows:

```
data Arith e = Val Int | Add e e
data Except e = Throw | Catch e e
```

These definitions capture the non-recursive aspects of expressions, in the sense that Val and Throw have no subexpressions, whereas Add and Catch have two apiece. We declare both Arith and Except as Haskell functors:

instance Functor Arith where

```
fmap _ (Val n) = Val n
fmap f (Add x y) = Add (f x) (f y)
```

instance Functor Except where

```
fmap _ Throw = Throw
fmap f (Catch x h) = Catch (f x) (f h)
```

For any functor f, its induced recursive datatype, Fix f, is defined as the least fixpoint of f. In Haskell, this is implemented as follows [MH95]:

```
newtype Fix f = In (f (Fix f))
```

For example, Fix Arith is the language of integers and addition, while Fix Except is the language comprising throwing and catching exceptions. We shall see shortly how these languages can be combined.

Of particular importance is the name of the data constructor associated with this least fixpoint construct, namely In, which we notice is the same name given to the morphism associated with a categorical initial algebra (recall Chapter 3.2). This is no coincidence, as it is appears when defining the fold operator [MFP91] used to write functions over Fix f [Swi08]:

```
fold :: Functor f \Rightarrow (f a \rightarrow a) \rightarrow Fix f \rightarrow a
fold f (In t) = f (fmap (fold f) t)
```

The parameter of type ($f a \rightarrow a$) is the f-algebra, which can be intuitively viewed as a directive for processing each constructor of a functor. Given such an algebra and a value of type Fix f, the fold operator exploits both functional and recursive characteristics of Fix to process recursive values.

The aim now is to take advantage of the above machinery to define a dynamic semantics for our expression language in a modular fashion. Such a semantics will have type $Fix f \to m$ Value for some functor f that captures the syntactic structure of the source language, monad f that captures the computational effects that are required by the source language, and semantic domain Value that captures the notion of fully evaluated results. To define functions of the requisite type using fold, we require an *evaluation algebra*, which notion we capture by the following typeclass definition:

```
class (Monad m, Functor f) => Eval f m where
  evalAlg :: f (m Value) -> m Value
```

Using this typeclass, we can now define algebras corresponding to the semantics for both the arithmetic and exception components:

```
instance ErrorMonad m => Eval Except m where
evalAlg (Throw) = throw
evalAlg (Catch x h) = x 'catch' h
```

There are three important points to note about the above instantiations. First of all, the semantics for arithmetic have now been completely separated from the semantics for exceptions, in particular by way of two separate instance declarations. Secondly, the semantics are parametric in the underlying monad, and can hence be used in multiple differing contexts. And finally, the operations that the underlying monad must support are explicitly qualified by class constraints, e.g. in the case of Except the monad must be an ErrorMonad. These latter two points generalise the work of Jaskelioff [Jas09] from a fixed monad to an arbitrary one supporting the required operations, resulting in a clean separation of the semantics of individual language components.

With this machinery in place, we can now define a general evaluation function of the desired type by folding an evaluation algebra:

```
eval :: Eval f m => Fix f -> m Value
eval = fold evalAlg
```

Note that this function is both modular in the syntax of the source language and parametric in the underlying monad. However, at this point we are only able to take the fixpoints of Arith or Except, not both. We need a way to combine signature functors, which is naturally done by taking their coproduct (or disjoint sum) [LHJ95b], noting that at this point we only consider the potential for a single 'recursive knot', namely the variable e. In Haskell, the coproduct of two functors can be defined as follows:

```
data (f :+: g) e = Inl (f e) | Inr (g e)

instance (Functor f, Functor g) => Functor (f :+: g) where

fmap f (Inl x) = Inl (fmap f x)

fmap f (Inr y) = Inr (fmap f y)
```

We can now define the coproduct of evaluation algebras:

```
instance (Eval f m, Eval g m) => Eval (f :+: g) m where
  evalAlg (Inl x) = evalAlg x
  evalAlg (Inr y) = evalAlg y
```

The general evaluation function can now be used to give a semantics to languages with multiple features by simply taking the coproduct of their signature functors. Unfortunately, there are three problems with this approach. First of all, the need to include fixpoint and coproduct tags (In,

Inl and Inr) in values is cumbersome unless we have a parser available. For
example, if we wished to manually enter the concrete expression 1 + 2 with
type Fix (Arith :+: Except) (for smoke testing purposes, perhaps), it
would be represented as follows:

Secondly, the extension of an existing syntax with additional operations (i.e. extending a language from type Fix (Arith:+: Except) to Fix (State:+: Arith:+: Except)) requires the modification of existing tags — Inl would need to be replaced by (Inl. In. Inr) for example — which breaks modularity. And finally, Fix (f:+: g) and Fix (g:+: f) are isomorphic as languages, but require different values to be tagged in different ways. In the next two subsections, we will describe how the datatypes à la carte technique resolves these concerns.

4.2.2 Smart Constructors

Given the concerns just described, it would be helpful to have a way of automating the injection of values into expressions such that the appropriate sequences of fixpoint and coproduct tags are prepended. This can be achieved using the concept of a *subtyping relation* on functors, which can be formalised in Haskell by the following class declaration, wherein inj injects a value from a subtype into a supertype.

```
class (Functor sub, Functor sup) => sub :<: sup where
  inj :: sub a -> sup a
```

We can now define instance declarations to ensure that f is a subtype of any coproduct containing f, via the following declarations:

```
instance f :<: f where
inj = id

instance f :<: (f :+: g) where
inj = Inl

instance (f :<: h) => f :<: (g :+: h) where
inj = Inr . inj</pre>
```

We note that an overlap occurs between the second and third instances, however this is not a problem in practice so long as right associativity is guaranteed via the use of an infixr declaration on (:+:).

Using this notion of subtyping, we can define an *injection function*:

```
inject :: (g :<: f) => g (Fix f) -> Fix f
inject = In . inj
```

We use inject to define *smart constructors* which bypass the need to tag values when embedding them in expressions (using the SC suffix to differentiate between smart constructors and the methods of the ErrorMonad class):

```
val :: (Arith :<: f) => Int -> Fix f

val n = inject (Val n)

add :: (Arith :<: f) => Fix f -> Fix f -> Fix f

add x y = inject (Add x y)

throwSC :: (Except :<: f) => Fix f

throwSC = inject (Throw)

catchSC :: (Except :<: f) => Fix f -> Fix f -> Fix f
```

Note the constraints stating that f must have the appropriate subtype functor; for example, in the case of val, f must support arithmetic.

4.2.3 Putting It All Together

We can now define language syntax in a modular manner. Using smart constructors, we can define values within languages given as fixpoints of coproducts of signature functors. For example:

```
ex1 :: Fix Arith

ex1 = val 18 'add' val 24

ex2 :: Fix Except

ex2 = throwSC 'catchSC' throwSC

ex3 :: Fix (Arith :+: Except)

ex3 = throwSC 'catchSC' (val 1337 'catchSC' throwSC)
```

The types of these expressions can be generalised using the subtyping relation, but for simplicity we have given fixed types above (the most general type we can obtain with no available information is $Eval\ f\ m \implies Fix\ f$). In turn, the meaning of such expressions is given by our modular semantics:

```
> eval ex1 :: Identity Value
> 42

> eval ex2 :: Maybe Value
> Nothing

> eval ex3 :: Maybe Value
> Just 1337
```

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Note the usage of explicit typing judgements to determine the resulting monad. Whilst we have used Identity and Maybe above, any monad

satisfying the required constraints can be used, as illustrated below:

> eval ex1 :: Maybe Value

> Just 42

> eval ex2 :: [Value]

> []

One final point to make in this chapter is that the modular abstract syntax we have introduced is currently *single-sorted*: that is to say, we cannot differentiate between the *purposes* of expressions. This is quite limiting, and we shall see how this can be generalised in Chapter 6.2.1.

4.3 Modular Compilation Algebras

With the techniques described in the previous two sections within this chapter, we can now construct a modular compiler for our expression language. First of all, we define the Code datatype of Chapter 2.1 in a modular manner as the coproduct of signature functors corresponding to the arithmetic and exceptional operations of the virtual machine:

```
data ARITH e = PUSH Int e | ADD e

data EXCEPT e = THROW e | MARK Code e | UNMARK e

data NULL e = NULL

type Code = Fix (ARITH :+: EXCEPT :+: NULL)
```

In the above, by defining the Op datatype (see Chapter 2.1) as a fixpoint, we have combined Op and Code into a single type defined using Fix, allowing code to be processed using the datatypes à la carte technique; note that NULL now plays the role of the empty list. More importantly, perhaps, is the fact that the handler argument to MARK has explicit type Code rather than the general type e. Our justification for doing this — rather than declaring that both arguments have type e — is that we wish to differentiate between the 'types' of subexpression that these two arguments will have without introducing bifunctors [MFP91]. More precisely, the recursive subexpressions of a signature – those of type e in the underlying functor – have their type specified by the compilation algebra, and we will shortly observe that this type is not compatible with the obvious type for handler subexpressions.

The desired type for our compiler is $Fix f \to (Code \to Code)$, for some signature functor f characterising the syntax of the source language. To define such a compiler using the generic fold operator, we require an appropriate compilation algebra, which notion we define as follows:

```
class Functor f => Comp f where
  compAlg :: f (Code -> Code) -> (Code -> Code)
```

In contrast with evaluation algebras, no underlying monad is utilised in the above definition, because the compilation process itself does not involve the manifestation of effects within the program itself being compiled (compiler implementations are themselves often stateful, but we are concerned only with the effects that a source program invokes). We can now define algebra instances for both the arithmetic and exceptional aspects of our modular compiler as follows:

```
instance Comp Arith where
  compAlg (Val n) = pushc n
  compAlg (Add x y) = x . y . addc

instance Comp Except where
  compAlg (Throw) = throwc
  compAlg (Catch x h) = \c -> h c 'markc' x (unmarkc c)
```

Similarly to the evaluation algebras defined in Chapter 4.2.1, note that these definitions are modular in the sense that the two language features are being treated completely separately from each other. We also observe that because the carrier of the algebra is a function, the notion of appending code in the case of the Add constructor corresponds to function composition.

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the handler argument to the MARK constructor breaks modularity. As we can now see, this argument, being of type Code, will act as the alternative code continuation in the event that an exception is thrown. However, were we to declare this argument as a recursive subexpression of type e, the compilation algebra would impose the type $Code \rightarrow Code$. This would then require us to provide an initial continuation to the composition ($h \circ c$) when *executing* the resulting code, which we have no sensible candidate for. Given our previously stated desire to avoid the usage of bifunctors, we must

Returning to the issue of the EXCEPT signature briefly, recall our claim that

modularity as things stand, as this reliance on a closed datatype leaves

therefore provide an explicitly typed argument. We claim that this breaks

no room for extensibility even if we redefine the type of the compilation

argument. We will see how we can solve this issue with stricter constraints

and existentials at the type level in Chapter 5.1.

The smart constructors pushe, addc and so on can be defined as follows:

```
pushc :: Int -> Code -> Code
```

addc :: Code -> Code

addc c = inject (ADD c)

The other smart constructors are defined similarly. Finally, we can now define a general compilation function of the desired type by folding a compilation algebra, with an initial accumulator empty:

```
comp :: Comp f => Fix f -> Code

comp e = comp' e empty

comp' :: Comp f => Fix f -> (Code -> Code)

comp' e = fold compAlg e

empty :: Code

empty = inject NULL
```

For example, applying comp to the expression ex3 = throw 'catch' (val 1337 'catch' throw) produces the following Code, in which the fixpoint and coproduct tags In, Inl and Inr have been removed for readability:

```
MARK (MARK (THROW NULL) (PUSH 1337 (UNMARK NULL)))

(THROW (UNMARK NULL))
```

4.4 Towards Modular Machines

What remains to complete our framework at this stage is the construction of a modular virtual machine which can execute code produced by the modular compiler defined in the previous section. We note that whilst a non-modular (or universal) virtual machine is also a viable candidate to target, we wish to explore the degree to which our treatment of datatypes and functions can accommodate all phases of our framework. We can now redefine the underlying Stack datatype of Chapter 2.1 in a modular manner, however the boilerplate code required to implement the appropriate execution algebras quickly becomes prohibitive. For this reason, we delay the implementation of modular virtual machines until Chapter 7.

4.5 Chapter Summary

At the end of each chapter from this one forwards, we will conclude with a section describing the general state of affairs of the framework we are developing to tackle the problem domain (as presented in Chapter 3), as well as explicitly identifying those tasks which we deferred treatment of until 'later on in the thesis':

In this chapter we have:

• Identified how the syntax of an embedded language can be written in a modular manner via signature functors, coproducts and least fixpoints.

- Identified how functions can be written over such modular syntax by applying an appropriate algebra to a fixpoint using a catamorphism.
- Shown how the notion of a subtyping relation on signature functors allows for the definition of constructors which derive the correct placement of a value within a modular source expression.
- Described how the semantics of a modular language defined using these techniques can be defined polymorphically over any monad supporting the requisite constraints and typeclass memberships.
- Defined a compilation scheme for our modular source language, mapping into a predefined modular target language, an approach which breaks modularity, as extending the chosen source would require editing the definition of the chosen target. A more elegant treatment would be to allow the algebra to target any language which meets the minimum requirements in terms of supported instructions. We treat this topic in the next chapter.

Chapter 5

Modular Compilers: Further

Refinements

At this point, we have established the fundamentals of our solution to the problem introduced in Chapter 3: we can define the syntax of a source language as a combination of signature functors describing the data constructors associated with particular computational features, we can define interpreters over languages which are parameterised over the requisite monad class needed to define their semantics, and we can define compilation schemes between the syntax of a source language and the instructions for a stack-based target language in an independent manner. In each of these cases, the underlying functorial representation can be exploited to combine multiple definitions into a single compound instance. The upshot of using

this approach is that a new feature can be defined and given a semantics and compilation scheme before being folded into the existing definition with no need for recompilation of code.

At this stage however, the expressiveness of our source language is limited to arithmetic and exception handling, and we determine the target language which we compile into in advance. In this chapter we introduce modular variants of the untyped λ -calculus and mutable state, describe how we can generalise the language we compile into to a parametrically polymorphic variant by making use of generalised algebraic datatypes (GADTs), and also how the combination of effects which can interact in noncanonical ways can be compiled into the appropriate instruction sets by way of three distinct parameterisation techniques. We begin with the most pressing issue at present, namely the generalisation of the target language for the compiler.

5.1 Generalised Algebraic Datatypes

In our initial presentation of the compilation typeclass (Chapter 4.3), the function comp targets a datatype Code that is constructed using the modular syntax techniques we introduced in Chapter 4. Recall both the definition of Code and that of the exception signature functor EXCEPT:

type Code = Fix (ARITH :+: EXCEPT :+: NULL)

data EXCEPT e = THROW e | MARK Code e | UNMARK e

As suggested when it was originally defined, there are issues regarding the definition of the MARK constructor. Whilst the target language Code is indeed modular, note that it is explicitly defined as a type synonym, predetermining the features of the target language. The usage of such a concrete type in the MARK constructor breaks precisely the modularity in the definition of the target language that we are trying to obtain. That is to say, if we decide to extend the source language with an additional feature, we need to declare a new type synonym consisting of the subsignatures of Code, in addition to the target signature associated with the feature being introduced. This new synonym must then be given to the MARK constructor and recompiled. Recall from the previous chapter our claim that we cannot simply replace the occurrence of Code in MARK with the variable e, due to the type of the compilation algebra:

We again highlight (as in Chapter 4.3) that typing the handler parameter as $Code \rightarrow Code$ would be incorrect due to the need to then provide suitable initial continuations to said handlers at the point of execution. Similarly, due to the modular nature of individual language signatures, were the argument to MARK to be polymorphic in the form (Fix h), a compile-time

error arises, as there is no way for GHC to infer the correct type for h since nothing is known about its component signatures. A potential solution is to extend the EXCEPT signature as follows:

However, turning the underlying functor h into a parameter in this manner essentially means that every language that makes use of EXCEPT now needs to explicitly refer to the overall functor h that captures all of the desired language features, which again breaks modularity. One approach to resolving this would be to impose a class constraint on the signature itself in the following manner:

Unfortunately, as of GHC version 7.2.1 this is no longer possible using the algebraic datatypes of Haskell¹. The solution to the deprecation of this feature is to define those signatures which contain constructors requiring constraints (such as MARK) as generalised algebraic datatypes (GADTs), permitting individual constructors to be typed explicitly with their own class constraints. For example, consider the GADT representation of the non-modular variant of Expr as originally presented in Chapter 3:

¹The pragma that allowed this – -XDatatypeContexts – was deprecated at this point, being widely considered a misfeature. The listed constraints were not actually enforced!

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data Expr e where

Val :: Int -> Expr Int

Add :: Expr Int -> Expr Int -> Expr Int

Throw :: Expr e

Catch :: Expr e -> Expr e -> Expr e

Note that this representation enables a level of type-safety that was previously unavailable. For example, consider the Add constructor, which dictates that only subexpressions which represent an Int can be added together. Whilst this type-safety is a desirable feature to have, we are primarily utilising GADTs to leverage existential types into our framework. By describing constructors as methods associated with a type, we can now impose constraints on individual constructors without affecting the datatype as a whole (and therefore achieve what the -XDatatypeContexts pragma was designed to do). Using this idea, the signature functor for exception handling in the target language can be redefined as follows:

data EXCEPT e where

THROW :: e -> EXCEPT e

MARK :: Functor $h \Rightarrow Fix h \Rightarrow e \Rightarrow EXCEPT e$

UNMARK :: e -> EXCEPT e

By using GADTs to define EXCEPT, we have made two significant improvements over the original definition. Firstly, by abstracting over the syntax of the target language we have avoided the need to refer to an explicitly defined type synonym – i.e. Code – that must be edited whenever the source language is changed, and secondly we have placed a constraint on the argument h without including this constraint in the top-level definition of EXCEPT (and thereby constraining the other constructors similarly). We note that a more *informative* constraint for MARK would be one that indicated that the functor h is indeed a valid target signature (i.e. can be 'compiled into'), however since instances of EXCEPT – and indeed, all other target signatures – are produced by well-formed source programs, we choose to leave the constraint as loose as possible.

This reformulation suggests that our modular compiler need not target a particular language defined in advance, but rather any language which contains the appropriate instructions. The modular counterpart of the compilation function comp should have type Fix $f \to Fix g \to Fix g$, for signature functors f and g that characterise the syntax of the source and target languages respectively. Furthermore, to supply an initial value for the accumulator (the second argument), we require that NULL (corresponding to the empty code fragment or the 'empty list', to serve as an initial accumulator) is a component of g. Putting this all together, we redefine the compilation typeclass as follows:

data NULL e = NULL

```
class (Functor f, NULL :<: g) => Comp f g where
  compAlg :: f (Fix g -> Fix g) -> Fix g -> Fix g
```

We can now instantiate the compilation algebras for Arith and Except using the subtype relation to constrain the target signature functor g to any language which supports the required signatures (where push, add, throw etc. are smart constructors):

```
instance (ARITH :<: g) => Comp Arith g where
  compAlg (Val n) = push n
  compAlg (Add x y) = x . y . add

instance (EXCEPT :<: g) => Comp Except g where
  compAlg (Throw) = throw
  compAlg (Catch x h) = \c -> mark (h c) (x (unmark c))
```

The resulting modular compilation function is obtained by folding the compilation algebra over an empty accumulator emptyC as follows:

```
emptyC :: (NULL :<: g) => Fix g
emptyC = inject NULL
```

```
comp :: Comp f g => Fix f -> Fix g
comp x = fold compAlg x emptyC
```

In the next section, we show how to extend the modular source language with support for variable binding, and in particular the role that GADTs play in defining its modular semantics.

5.2 The Untyped λ -Calculus

The ability to abstract over variables in the body of a function is a near-universal feature in programming languages, and in this section we will introduce variable binding into our modular framework using the untyped lambda calculus of Church [Chu36]. We will begin by formally introducing the notation and reduction-rules of the lambda calculus, before moving on to our treatment of a modular representation within our framework.

5.2.1 A Formal Treatment Of The λ -Calculus

Initially constructed by Alonzo Church in 1932 as a model of effective computability [Chu32], the first variant of the λ -calculus concerning the foundations of mathematics was proven logically inconsistent with Curry's combinatory logic [Cur30] via the Richard paradox by the Kleene-Rosser paradox [KR35] in 1935.

As a result, the portion of the λ -calculus solely devoted to computation was isolated and published seperately in 1936 [Chu36], and is today referred to as the untyped λ -calculus. Whilst a typed variant was produced in 1940 [Chu40], this thesis considers only the former.

Definition Of The Untyped λ -Calculus

Untyped lambda expressions are constructed from the following:

- Variables v_1, v_2, v_3, \ldots
- The terminal symbols λ and (.).
- Left and right parentheses (and).

The set of all lambda expressions Λ is defined inductively:

- 1. If v is a variable, $v \in \Lambda$.
- 2. If v is a variable and $\mathbf{M} \in \Lambda$, then $(\lambda v \cdot \mathbf{M}) \in \Lambda$.
- 3. If \mathbf{M} and $\mathbf{N} \in \Lambda$, then $(\mathbf{M} \cdot \mathbf{N}) \in \Lambda$.

A variable associated with a λ symbol is said to be *bound* if it appears within the body of an abstraction (an *anonymous function*), and the (.) symbol is notation for function application. For example, in the lambda

expression (λx . x y x), x is bound. In contrast, those variables that are not bound are said to be *free*. The set of free variables of an expression M, denoted $\mathbf{FV}(M)$ is defined recursively over the structure of the expression:

- $\mathbf{FV}(v) = \{v\}$, where v is a variable.
- $\bullet \ \mathbf{FV}(\lambda v \ . \ \mathtt{M}) = \mathbf{FV}(\mathtt{M}) \setminus \{ \ v \ \}$
- $\mathbf{FV}(M \cdot N) = \mathbf{FV}(M) \cup \mathbf{FV}(N)$

An expression M containing no free variables (i.e. $\mathbf{FV}(M) = \emptyset$ is *closed*. For the purposes of this thesis, closed expressions are particularly important as they represent programs which can be fully evaluated.

At this point, we must recognise that lambda expressions are given meaning by the way in which they are evaluated. There are multiple notions of reduction and conversion which can be applied when manipulating said expressions, but for our purposes we focus on three in particular, namely α -conversion, β -reduction, and term substitution.

α -Conversion

Also known as α -renaming, the process of renaming the bound variables of a lambda expression in a manner producing an expression describing the same function is referred to as α -conversion. For example, the expression

 $(\lambda x. \lambda y. x z y)$ can be α -converted to $(\lambda a. \lambda b. a z b)$. Note that care must be taken to avoid *name capture*, e.g. renaming $(\lambda x. x y)$ to the different expression $(\lambda y. y y)$.

β -Reduction

The application of an argument to a function is commonly known as a β reduction. More generally, we often think of such a reduction as a single
computational step. For example, given the expression $(\lambda \mathbf{x}.\lambda \mathbf{y}.\mathbf{x}+\mathbf{y})$ (assuming both \mathbf{x} and \mathbf{y} represent integers, with addition defined in the
usual manner), its application to the argument 40 can be β -reduced to $(\lambda \mathbf{y}. 40 + \mathbf{y})$. Importantly, we observe that β -reduction is defined in
terms of capture-free substitution, as shown in the next section.

Term Substitution

Substitution, an operation which we denote as E[V := R], is the replacement of all *free* instances of the variable V in the expression E with the expression R. Substitution over a λ -expression is defined recursively (below, x and y are variables, and M and N are metavariables over λ -expressions):

- $x[x := N] \equiv N$
- $y[x := \mathbf{N}] \equiv y \text{ if } y \neq x$

- \bullet $(\mathbf{M}_1 \cdot \mathbf{M}_2)$ $[x := \mathbf{N}] \equiv (\mathbf{M}_1[x := \mathbf{N}] \cdot \mathbf{M}_2[x := \mathbf{N}])$
- $(\lambda x \cdot t) [x := r] \equiv (\lambda x \cdot t)$
- $(\lambda y \cdot t) [x := r] \equiv \lambda y \cdot (t [x := r]) \text{ if } x \neq y, y \notin \mathbf{FV}(r)$

As the latter two cases above indicate, we need to be certain that we are not going to substitute in a term containing a variable that is already bound by the term being substituted into (referred to as *capturing* a variable). This is undesirable, as doing so can change the semantics of a lambda expression.

Capture-Free Substitution

One potential solution 2 for performing substitution in a capture-free manner lies in renaming the conflicting bound variables from the term being substituted to unique identifiers, thereby assuring that the substitution does not capture any existing variable. By α -converting the relevant variables in such a way that fresh names are used where needed, we can reformulate the case for substituting into an abstraction as follows:

•
$$(\lambda y \cdot t) [x := r] \equiv (\lambda y \cdot t)$$

if $x \equiv y$

•
$$(\lambda y \ . \ t) \ [x := r] \equiv \lambda y \ . \ (t \ [x := r])$$

if $x \not\equiv y \wedge y \not\in \mathbf{FV}(r)$

²We will encounter other solutions shortly.

•
$$(\lambda y \cdot t) [x := r] \equiv (\lambda z \cdot (t [y := z])) [x := r]$$

if $x \not\equiv y \land z \not\in \mathbf{FV}(r) \land z \not\in \mathbf{FV}(t)$

The notion of β -reduction can now be defined simply in terms of capturefree substitution via the equation $(\lambda x \cdot t) u \equiv t[x := u]$.

One may wonder why we are going through such pains to describe substitution in a capture-free manner. Whilst it is indeed important that the substitution operation is semantically sound, we do so here to illustrate the fact that there are implementation issues that require additional boilerplate code to resolve, particularly when managing variable names. An implementation that avoids these concerns is preferable, and it is this point which justifies the model that we use within our modular framework.

5.2.2 A Modular λ -Calculus

Although the variables used for abstraction purposes in lambda terms are often given names in the same way that we would name other variables, there are many alternative ways to model bindings, including such approaches as higher order abstract syntax (HOAS) [PE] and de Bruijn indices [dB72], amongst others. The HOAS approach approach uses the binders of Haskell to describe the binding structure of the language being implemented, via a datatype such as:

data LambdaH e = App e e | Lam (e -> e)

The argument to the Lam constructor in the above explicitly prevents LambdaH from being an instance of the Functor typeclass, as we cannot apply the fmap method to this argument in a sensible manner. More formally we observe that the Lam variable e appears in both a covariant and contravariant position; this point is discussed in finer detail in [MH95]. We can still define catamorphisms over LambdaH as a difunctor by using a more refined fold operator; however this adds significant amounts of both complexity and boilerplate to the underlying technique. As such, for simplicity's sake – alongside the desire to avoid implementing capture-free substitution – in this thesis we use a de Bruijn indexed encoding of the lambda calculus. In this encoding, the syntax of lambda expressions is defined in the following manner:

data Lambda e = Index Value | Abs e | Apply e e

The Value type associated with an Index constructor represents some datatype that gives rise to an integer constructor that can represent a variable, where the integer refers to the number of lambda operators in scope ³ before its binding site (note that we have previously encountered Value in Chapter 4.2: we state at this point that this type should be modular to

³An interesting potential research direction is the usage of the type system to ensure scope correctness for terms constructed in this way.

account for the potential for other features being included, but we do not do so here for ease of explanation). The Abs constructor indicates the presence of a binder, and Apply represents the substitution of lambda terms, and is passed both a function body and its argument as subexpressions.

However, by choosing not to use the HOAS approach, an issue arises when considering the Apply constructor. Specifically, when defining a modular semantics for the Lambda signature, the carrier of the evaluation algebra determines that both subexpressions would be typed (m Value), a problem avoided by HOAS by only deeming valid those expressions wherein the first subexpression is a Lam constructor. The following attempt at defining the evaluation algebra illustrates the problem:

```
instance Monad m => Eval Lambda m where
  -- evAlg :: Lambda (m Value) -> m Value
  evAlg (Apply f x) = f >>= \f' -> ...
```

The definition of Apply cannot be completed in a sensible way, because the semantic domain is not expressive enough. In particular, the result of binding the function body f has the primitive type Value which accepts no arguments (whereas the Lam constructor of LambdaH is typed $(e \rightarrow e)$). Moreover, binding the result of f breaks the abstraction that a function body represents.

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Our solution to this issue is to extend the semantic domain Value with

support for closures: pairs consisting of functions and environments defin-

ing their non-local variables. To do this, we define Value as follows (again,

we are defining Value as a GADT here rather than as a modular datatype

simply to avoid boilerplate):

data Value m where

:: Int -> Value m

Clos :: Monad $m \Rightarrow [Value m] \rightarrow m (Value m) \rightarrow Value m$

Above, the Num constructor represents an integer value, and the Clos con-

structor takes as arguments a list of values (i.e. an environment) and a

computation which represents an unevaluated function body. There are

two points to note about this definition. Firstly, we would not be able

to represent closures in this way without the (Monad m) constraint (as we

need to suspend the evaluation of the function body within a monad until

required) and secondly, this constraint is only imposed within the Clos

constructor, meaning that those subexpressions that do not make use of

lambda expressions can safely use () as the parameter to Value rather than

a monad which is not used.

To make use of closures when giving a semantics to the lambda calculus,

we define a class CBVMonad of operations associated with the call-by-value

evaluation scheme, which reduces arguments to values prior to their use:

```
class Monad m => CBVMonad m where
env :: m [Value m]
```

```
with :: [Value m] -> m (Value m) -> m (Value m)
```

Intuitively, the env operation provides the list of values that are currently in scope, and the with operation takes both an associated environment and a computation, returning the result of performing substitution. We can now give a semantics to the λ -calculus signature, using the CBVMonad class constraint to allow the use of the env and with methods as follows:

In the above, a de Bruijn index is evaluated by looking up the index in the current environment, a lambda abstraction is packaged up with the current environment to form a closure, and substitution of lambda expressions is performed by evaluating argument x, adding this value to the environment

of the closure associated with the function body, and finally evaluating the function body with respect to this updated environment. Implicit in the above is that all lambda expressions we define must be *closed*, as permitting open terms would require that we also keep track of the largest de Bruijn index at a given point in an expression.

We can now write expressions in our modular source language that make use of variable binding. For example, consider the following example (where apply, abs, etc. are the appropriate smart constructors, and Identity is used in order to permit the do-notation in the evaluation algebra for Lambda):

```
e :: Fix (Lambda :+: Arith)
e = apply (abs (ind 0)) (add (val 1) (val 2))
> eval e :: [Value Identity]
[Num 3]
```

The source language used in this example is capable of using both variable binding and arithmetic. The expression e represents the lambda expression $(\lambda x \cdot x)(1 + 2)$, and evaluating e with respect to (for example) the list monad, which can readily be made into an instance of the CBVMonad class, returns the singleton value Num 3.

We can also define multiple evaluation schemes for terms within the lambda calculus. A common alternative to call-by-value is *call-by-name*, which does not evaluate arguments before applying them to a function body. The difference between this and call-by-value is that environments contain *computations*, not values. Another class, CBNMonad, is needed to reflect this change:

```
class Monad m => CBNMonad m where
  env :: m [m (Value m)]
  with :: [m (Value m)] -> m (Value m) -> m (Value m)
```

Constraining by this class allows a call-by-name semantics to be defined for the lambda calculus signature as follows:

This definition is similar to that for call-by-value evaluation, the main difference being that the substitution of terms does not bind the argument \mathbf{x} to a value prior to using it.

We have presented two separate evaluation algebras, both defined over a signature Lambda. However, despite the differing contexts, Haskell does not permit the two algebras to coexist in the same source file, stating that they are overlapping instances: GHC does not consider differing class constraints a sufficient distinction between two instances as to suggest uniqueness. One possible solution is to define two source signatures LambdaCBV and LambdaCBN which contain appropriately tagged constructors to avoid naming conflicts. An alternative involves parameterising the evaluation algebra class with a tag that can be pattern-matched upon, and we will see this idea in action in the final section of this chapter when discussing a solution to the issue of noncommutative effects.

5.2.3 Compiling λ -Calculi

In order to execute programs which make use of the lambda calculus as defined in the previous section, instruction sets for the two variants (call-by-value and call-by-name) must be defined separately (newtypes could be used to distinguish the evaluators, but this may prove quite confusing in practice). To this end, we define two target signatures, corresponding

to the stack instructions for variants of a Categorical Abstract Machine (CAM) [CCM85] and Krivine machine [Ler90, Cur91], respectively:

The above constructors are sufficient for us to look up values in environments by de Bruijn index, build closures, evaluate function bodies and arguments and execute code with a given environment: the *semantics* of these constructors are based upon the following compilation schemes C and K targeting the CAM and Krivine machine respectively:

$$\mathbb{C}[n] = [\mathtt{IND}\ n]$$

$$\mathbb{C}[\lambda\ t] = [\mathtt{CLS}\ (\mathbb{C}[t] ++ [\mathtt{RET}])]$$

$$\mathbb{C}[f\ x] = \mathbb{C}[x] ++ \mathbb{C}[f] ++ [\mathtt{APP}]$$

$$\mathbb{K}[n] = [\mathtt{ACS}\ n]$$

$$\mathbb{K}[\lambda\ t] = [\mathtt{GRAB}] ++ \mathbb{K}[t]$$

$$\mathbb{K}[f\ x] = [\mathtt{PSH}(\mathbb{K}[x])] ++ \mathbb{K}[f]$$

We have chosen to show the compilation schemes for the above rather than the code representing their compilation algebras, as we believe that the above is better suited to demonstrating the translation between the source and target languages; however the definitions for said algebras follow directly. For example, an abstraction over a term is translated under the Krivine machine model into a GRAB instruction appended to the result of recursively translating the underlying term itself. As alluded to at the end of Chapter 4, we defer the explanation and implementation of the virtual machine defining the *operational semantics* of these two machines until Chapter 7.

Having successfully implemented variable binding modelled using the lambda calculus in a modular manner and presented the compilation schemes for two distinct models of execution, we now consider how to introduce persistent, updatable state into our modular compilation framework.

5.3 Introducing Modular Mutable State

In programming languages, a commonly used feature is that of *mutable* state variables that can change their value over time. In this section, we extend the expressive power of a modular source language by introducing the notion of modular mutable state. To begin with, we consider a single-celled state consisting of an integer as the state domain, although as we have seen with the lambda-calculus, lifting these definitions into a modular Value datatype is straightforward. This single-celled state is presented simply as a proof of concept, however, as we shall see in Chapter 7 how

this can be generalised to a countably infinite key-value table of states.

The syntax associated with such an updatable integer value is given by the following signature functor:

In the above, the Get operation returns the current state, and the Set operation takes an integer and an expression which treats this new value as the current state. As with each new feature, we define a class StateMonad of associated operations:

The update operation takes a function $Int \to Int$ and uses it to alter the state variable. By passing different functions to update, it can be used to define an evaluation algebra for the State signature:

When evaluating a **Get** constructor, the **update** operation is passed the identity function **id**, leaving the state value unchanged. This value is then

bound to n and embedded into the Value domain. In turn, when evaluating a Set constructor, update is passed an anonymous function overwriting the state to v before evaluating subexpression c.

We can now write terms in our modular source language that utilise an integer state variable. To illustrate, consider the following two terms, built from languages supporting both arithmetic and state, and state and exception handling, respectively:

```
x :: Fix (Arith :+: State)
x = set 1 (add get (val 2))

y :: Fix (State :+: Except)
y = set 1 (catch throw get)
```

Informally, the expression x first sets the state to have value 1, then adds the current state to the number 2. In turn, expression y first sets the state to number 1, then immediately throws an exception that is handled by returning the current value of the state.

Recall that in our modular compilation framework, we evaluate a modular expression with respect to a monad that has been constructed by applying the appropriate monad transformers to a base monad, for which purposes we often use the identity Identity. The underlying machinery associated

with the monad transformer class allows access to the operations associated with each constituent feature (such as throw, update, env etc.) at the top level, with all of the necessary lifting handled automatically.

Recall that each monad transformer comes equipped with an accessor function – such as runS and runE – with allow access to the underlying representation. By first evaluating an expression and then applying the desired series of accessor functions, we obtain a final value, as illustrated below (using () as the parameter to Value as we do not require the closures from the lambda calculus):

```
newtype StateT s m a =
   S { runS :: s -> m (a, s) }
newtype ErrorT m a =
   E { runE :: m (Maybe a) }

> let a = eval x :: StateT Int Identity (Value ())
> runS 0 (runId a)
Num 3

> let b = eval y :: ErrorT (StateT Int Identity) (Value ())
> runE (runS 0 (runId b))
Just (Num 1)
```

In both of the above evaluations, we see that modular expressions involving state are given a semantics by applying the StateT state monad transformer at some point when building the monad, and similarly that the ErrorT exception monad transformer is applied when handling exceptions modularly.

However, an issue arises when considering the *order* in which certain monad transformers are applied, namely that of *noncommutative effects*. To illustrate, consider the following:

The above instantiations and instance declarations of the StateT monad transformer appear at first glance to be no different to that of any other

transformer associate with a particular feature. However, in the next section we shall see that defining StateT in this manner leads to noncommutativity concerns.

5.3.1 The Noncommutativity Of Effects

We have just seen how monad transformers are used to access the operations needed to define evaluation algebras. However, in some cases separate features can interact in multiple ways, and this is reflected when applying the associated monad transformers in different orders. Consider the following expression demo, constructed from a modular source language which supports arithmetic, mutable state and exception handling:

```
demo :: Fix (Arith :+: Except :+: State)

demo = set 0 (catch (add (set 1 get) throw) get)
```

The demo example must be evaluated within a monad that supports both exception and state, and therefore must contain both of the relevant monad transformers. It is less obvious, however, that switching the order in which these two transformers are applied has an observable effect on the resulting semantic domain. Assuming that no other features are present, and using Identity as the base monad, the types resulting from the two possible orderings are:

```
type LocalM a =
   StateT Int (ErrorT Identity) a
= Int -> ErrorT Identity (a, Int)
= Int -> Identity (Maybe (a, Int))
= Int -> Maybe (a, Int)

type GlobalM a =
   ErrorT (StateT Int Identity) a
= StateT Int Identity (Maybe a)
= Int -> Identity (Maybe a, Int)
= Int -> (Maybe a, Int)
```

In particular, when applied to a parameter a, the underlying representation of the LocalM monad takes an Int and either successfully returns a pair (a, Int), or an exception in the form of Nothing. In turn, the GlobalM monad also takes an Int but always returns a pair, where the first element can return Nothing.

More specifically, when handling an exception the 'local state' monad restores the state to its most recent value prior to entering the catch-block that threw the exception, while the 'global state' monad treats any updates to the state value as irreversible. Specifically, demo produces the

value Num 1 when evaluated with respect to GlobalM, and the value Num 0 with respect to LocalM.

These are both sensible results, and depend on how we wish to order the underlying effects: the local version has a transactional nature to it, which may better capture the particular requirements of a given situation. The natural progression at this point is to address the issue of compiling expressions with multiple interpretations, such as demo, in a modular manner. Our modular compiler will currently compile demo to the following code sequence (written using Haskell list notation):

> comp demo []

[SET O, MARK [GET] [SET 1, GET, THROW, ADD, UNMARK]]

The above code is associated with the *global* approach to state, as the SET operation within the catch-block cannot be reversed when the THROW instruction is encountered. To model the behaviour associated with the local approach to state, two additional operations are required:

> comp demo []

[SET O, MARK [RESTORE, GET]

[SAVE, SET 1, GET, THROW, ADD, UNMARK]]

The SAVE operation records the current value of the state on the stack, and in turn the RESTORE operation restores the state to its previous value before the handler code is executed.

Both of the above results are valid, corresponding to compiling demo with respect to a particular ordering of effects. However, a modular compiler is only capable of generating *one* such program in any particular session, as the compilation algebra class is only parameterised by the source and target signatures, with no information available concerning intended semantics.

Clearly, there is a need for a more flexible compilation algebra that is aware of the *context* of an argument expression. To do this, we must allow the compilation algebra to examine the monad in which an expression is evaluated, as the semantics are defined by the order in which certain monad transformers are applied.

5.3.2 Monadic Parameterisation

In this section, we propose three distinct techniques for directing the modular compilation of an expression by inspecting its underlying semantic monad. As we have seen, in our framework we make use of monads that have been constructed by applying a sequence of transformers to a base monad. Taking advantage of the fact that monad transformers are defined as newtypes, we can inspect their constructors at the type level, giving rise to our first technique:

Type-Level Monadic Parameterisation

In the above, the compilation algebra class is parameterised by a monad. The algebra carrier then includes a monadic computation as an argument, however this computation is parameterised by the void type () to indicate that the monad is not explicitly used in the compilation process, but rather used as a context reference.

In this manner, multiple instances of a compilation algebra can be defined for a single source signature by pattern-matching upon constructors associated with monad transformers. This allows for expressions such as demo (defined in the previous section) to be compiled using different schemes for different orderings of effects. For example, the compilation schemes for the two different orderings of exceptions and state can now be defined:

```
-- global compilation scheme

instance (EXCEPT :<: g, Monad m) =>

Comp Except g (ErrorT (StateT s m)) where

compAlg (Throw) = \_ -> throw

compAlg (Catch x h) = \m c -> mark (h m c)

(x m (unmark c))
```

An advantage of this technique is that we only need to match on constructors associated with monad transformers that cause semantics to differ. For example, consider the *commutative* monad transformer ReaderT:

```
newtype ReaderT w m a = R { runR :: w -> m a }
```

As the name suggests, commutative monad transformers will affect the semantics of a given monad in the same manner whether it is applied before or after any *other* given transformer. If ReaderT were to appear between

ErrorT and StateT in the above, we could abstract over this transformer using a generic variable t of type MonadT, allowing the programmer to focus on the task of defining algebras only for noncommutative orderings. This leaves us with a choice to make. Either; for each noncommutative transformer pair, define two algebra instances (one with, and one without intermediate transformers), or insist that each transformer pair (whether noncommutative or not) is interspersed with an Identity commutative transformer in order to cut down the number of algebra instances required. In either case, modularity is somewhat impaired.

More importantly, however, the monadic computation that appears in the carrier of the algebra allows for effectful operations to be manifested by calling its associated methods. The user must be careful to not use any monadic operations when defining a compilation algebra for a particular signature, as we define compilation to be an effect-free mapping between modular source and target languages. Further, this computation cannot be removed from the carrier, as it must be threaded through to subexpressions.

Function-Level Monadic Reification

In order to exclude the possibility of monadic operations being invoked during compilation, we require a way to provide the compilation algebra with information concerning the ordering of monad transformers, without explicitly passing around the resulting monad. A solution to this issue is to use GADTs to *reify* a monad, representing it as a sequence of constructors. We capture this notion with the datatype MTL, defined as follows:

```
data ST = IntT | BoolT | ...

data MTL m where

Err ::     MTL m -> MTL (ErrorT m)

Sta :: ST -> MTL m -> MTL (StateT ST m)

...

Id ::     MTL Identity
```

Using the auxiliary datatype ST of *state types* to reify monad transformer parameters, an instance of MTL m represents the monad m by applying the appropriate constructors to Id. We note that by defining MTL as an ordinary ADT, the set of effects that can be handled is closed, but a modular representation is also possible, at the cost of including the appropriate constraints when defining instances of the resulting datatype. To illustrate, the two monads LocalM and GlobalM that are defined in the previous section can be reified as follows:

```
local :: MTL (StateT ST (ErrorT Identity))
local = Sta IntT (Err Id)
```

```
global :: MTL (ErrorT (StateT ST Identity))
global = Err (Sta IntT Id)
```

There are two points to be made concerning the above. Firstly, by using ST to abstract over the parameter type of state monad transformers, we are highlighting that it is the *structure* of the underlying representation that we are concerned with, as opposed to the actual types involved. Secondly, the ordering of the monad transformers can now be examined at the *function level* by using pattern matching on the data constructors Sta and Err, .

We can now replace the monadic computation m () in the carrier of the compilation algebra with its reified representation MTL m. In doing this, we eliminate the concern that effectful operations may 'leak' into the compilation process by removing the possibility of invoking any monadic operations. This leads to the definition of our second technique:

By performing case analysis on the MTL argument, we can now define multiple compilation schemes within a *single* compilation algebra instance, as seen in the following:

```
instance (EXCEPT :<: g) => Comp Except g where
  compAlg (Throw) = \_ _ -> throw
  compAlg (Catch x h) = \m c -> case m of
  (Err (Sta s t)) ->
    mark (h m c) (x m (unmark c))
  (Sta s (Err t)) ->
  mark (h m c) (save (x m (restore $ unmark c)))
```

Particularly important here is that the compilation algebra is no longer parameterised by a monad m, highlighting the fact that a modular compiler is informed by a monad, rather than defined in terms of one. Also interesting is the potential to introduce predicates (of a sort) over instances of the MTL datatype in order to bypass intermediate transformers of no interest, for example:

```
globalState :: MTL m -> Bool
globalState (Sta s t) = containsError t
globalState (Err _) = False
globalState ... = ...
```

Constraint-Level Monadic Proxies

The previous two approaches represent two extremes of the solution spectrum: either put all the information about the monad (this information arguably being primarily of use to the programmer constructing new compilation algebras) within which an expression is evaluated into an argument m () and inspect it at the type-level, or reify the monad into a 'list' of constructors MTL m and pattern-match upon it at the function-level. Our third approach represents a meeting point between the two, by passing the monad as a type argument to a proxy datatype which cannot access the underlying monad, but is still aware of the context within which it is defined:

The data constructor Proxy can be threaded through to the carrier of a compilation algebra and retain the correct type (in much the same way as the empty list [] retains its type), and we are prohibited from invoking monadic operations. The resulting compilation typeclass that makes use of this is defined as follows:

We believe that this approach is the best of the three, minimising the presence of the monad within the compilation algebra, the boilerplate code required to implement said algebra, and the risk of invoking stateful operations in a context where no such operations should appear. However,

each approach has their use, and the choice of which one best suits their needs or taste is ultimately one for the user, in light of the necessity of the compilation algebra to be able to account for all possible interactions. In this sense, the compilation algebra is less modular than its evaluation counterpart, but we believe this to be a necessary consequence of ensuring that expressions are compiled into the 'correct' target instruction set.

5.4 Chapter Summary

In this chapter we have:

- Extended our framework with support for both mutable state and a de Bruijn indexed variant of the lambda calculus, improving the expressive power of a modular source language.
- Shown how the use of generalised algebraic datatypes to model troublesome signature functors and value domains permits certain forms of type constraints to be captured in a clean and modular manner.
- Defined modular variants of a Categorical Abstract Machine and the Krivine machine as suitable targets for our implementation of the lambda calculus. However, as in the previous chapter, we defer all notion of virtual machines and their construction to Chapter 7, where they will be treated in depth.

• Considered the issue of effects that do not commute (such as exceptions and state), which potentially require programs to be compiled in different manners depending on the ordering of the effects, and present three approaches to addressing this.

Chapter 6

Modular Control Structures

At this point, our framework supports multiple source features and targets any language supporting the appropriate instructions. We have seen how troublesome constructors within an individual source signature can have their constraints integrated into the constructor itself by using GADTs, and how the associated evaluators for modular source programs are parametrically polymorphic in the monad that they are evaluated within. Moreover, we have identified the issue of noncommutative effects and the impact that monad transformer ordering can have on the required instruction set of a target program, and provided multiple solutions for this. However, the source programs which we can write thus far are limited, particularly as we have not yet considered the issue of control flow.

In this chapter, we introduce a number of new features to the source syntax implementing cyclic and non-cyclic control flow, further improving the expressive capabilities of source programs. We identify the fact that the presence of such constructs in our source language introduces an entirely new class of incorrect programs, and modify the representation of the syntax of source signatures to solve the issue. We go on to discuss what the presence of cyclicity means for both the compiler itself and the syntax the compiler maps into, and redesign the target representation appropriately.

6.1 Introducing Control Flow

When considering the taxonomy of computational language features, we typically distinguish between two varieties: firstly, effectful features, such as exception handling and mutable state that we have treated in the previous two chapters, and secondly those features which relate to control-flow, such as conditionals and recursion.

In this section, we once again extend the expressive capability of our modular compilation framework, this time with features drawn from the latter category above. We will show that our framework is sufficiently flexible to accommodate this type of feature with minimum effort, and how refining the representation of the target language to use graphs instead of fixpoints unlocks the full breadth of expressibility afforded by these new constructs.

6.2 Re-representing the Source Language

Our goal in this chapter is to be able to compile source languages which contain modular representations of imperative control structures such as loops and conditionals. To do this, we require more care when choosing an appropriate representation of the abstract syntax trees of the source language. Specifically, we claim that the initial algebra representation that we have been working with throughout the previous two chapters is insufficient for this purpose. To illustrate, assume the existence of a loop signature:

data For e = For e e

The above represents loops with the following intended semantics: the first argument evaluates to an integer value n, and the second argument is then iterated n times. The problem with this representation is that it uses the same 'sort' to represent both expressions and statements. Within a loop we typically expect the first argument to be an expression (i.e. something that evaluates to a value), whereas the second argument is a statement (i.e. something that causes side effects such as variable assignment). Whilst it is possible to incorporate the distinct notions of expressions and statements into a single type, simplifying the implementation of both an interpreter and a compiler, their implementations can be inefficient.

Given that we want to compile the source language into code that runs on a stack-based virtual machine, we face the problem of having to clean up the stack after 'executing' an expression whose value is not used. For instance, consider the following example:

```
simpleLoop :: Fix (For :+: Arith)
simpleLoop = for (val 10) (val 42)
```

The above is a loop that repeats its body 10 times, and where the body of the loop pushes the integer 42 onto the stack. However, since this value is not used after being pushed, the code associated with the body of the loop needs to end with an instruction that removes the topmost element from the stack. We note that this issue does not only appear within the above example, but is a symptom of a more general problem with the current source syntax representation. To illustrate, assume the existence of a signature State with get and set operations defined over a single integer state domain. Then, the following loop simply produces the result of adding ten consecutive numbers, beginning from the current state value:

```
countLoop :: Fix (For :+: State :+: Arith)
countLoop = for (val 10) (set (get 'add' val 1))
```

In this example, set (...) must have a semantics that adds a 'result' – a meaningless placeholder value, as the expected result from a setter operation is () – to the top of the stack, as it is in the same syntactic category as val 10. Here too, we must clean up the stack after each iteration. The only systematic solution to the problem presented by the two examples given above is to distinguish between two *syntactic categories*: statements, with the invariant that their execution leaves the stack unchanged; and expressions, with the invariant that evaluating them puts their result on top of the stack. While these invariants can be, in principle, enforced independent to the representation of the syntax, mistakes are easy to make given the current representation.

6.2.1 Splitting the Source Language

In order to split the source language into different syntactic categories, we make use of Johann and Ghani's initial algebra semantics of GADTs [JG08]. The underlying idea is that each node of a tree type is annotated at the type level with the syntactic category it resides in. To this end, we extend each signature functor with an additional type argument, noting that these augmented signature functors are no longer functors in the Haskell typeclass sense (we shall see why shortly). For example, using Haskell's GADT syntax, we can now redefine Arith as follows:

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data Exp

data Arith e 1 where

Val :: Int -> Arith e Exp

Add :: e Exp -> e Exp -> Arith e Exp

Note that we define an empty datatype Exp as a label – or more precisely, an index – for expressions. The Arith signature is simple - the addition operator only takes expressions and returns expressions. More interesting is the signature for assigning and dereferencing mutable variables:

data Stmt

data State e 1 where

Get :: Ref -> State e Exp

Set :: Ref -> e Exp -> State e Stmt

Note that the Get constructor builds an expression, while the Set constructor takes an expression and builds a statement. Whilst in Chapter 5.3 we assume the presence of a *single* integer as the state space, and thus require no argument to the Get constructor as there was no ambiguity to resolve, in Chapter 6.3.1 we will extend the state space to arbitrarily many mutable references – or variables – which we represent as type Ref. For simplicity, we assume that these variables are just strings, i.e.:

newtype Ref = Ref String

As we have already noted, the above indexed signatures are no longer Haskell functors: instead of mapping types to types, they map functors to functors (and, in turn, natural transformations to natural transformations). In the language of Johann and Ghani, these signatures are akin to higher-order functors, and throughout this chapter we shall explore their properties and the recursion schemes they give rise to.

We introduce new type constructors that lift the definitions of (:+:) and Fix to the higher-order setting by equipping them with an additional type argument:

```
data FixH f i where
InH :: f (FixH f) i -> FixH f i
```

As expected, the fixpoint of a higher-order functor is itself a type function of kind (* \rightarrow *) (in other words, a family of types). In the case of the syntax trees for our target language, this family consists of the different syntactic categories we want to represent. Concretely, FixH (Arith ::+ For) Exp is the type of expressions over the signature (Arith ::+ For), whilst FixH (Arith ::+ For) Stmt is the corresponding type of statements.

We can make use of these higher-order syntax trees to keep track of the types of subexpressions within our source language. To do this, we parameterise Exp with an argument indicating the value type of a given expression. For simplicity, here we only consider integer and Boolean expressions:

```
data Exp e

data IntType

data BoolType

type IExp = Exp IntType

type BExp = Exp BoolType
```

To illustrate, the definition of the higher-order representation of Arith changes as follows:

```
data Arith e l where
```

Val :: Int -> Arith e IExp

Add :: e IExp -> e IExp -> Arith e IExp

In order to construct Boolean-valued expressions within this setting, we introduce a new signature Comp of operators comparing integer expressions:

```
data Comp e 1 where
   Equ :: e IExp -> e IExp -> Comp e BExp
   Lt :: e IExp -> e IExp -> Comp e BExp
```

Signatures for control structures and exceptions are defined similarly:

```
data While e l where
While :: e BExp -> e Stmt -> While e Stmt

data Seq e l where
Seq :: e Stmt -> e Stmt -> Seq e Stmt

data If e l where
If :: e BExp -> e Stmt -> e Stmt -> If e Stmt
```

Throw :: Except e Stmt

data Except e 1 where

Catch :: e Stmt -> e Stmt -> Except e Stmt

In the next section, we will see that the machinery needed when defining folds on higher-order fixpoints – and defining higher-order smart constructors – is easily carried over to the setting of higher-order functors.

6.2.2 Higher-Order Folds & Smart Constructors

As mentioned above, higher-order functors map both functors to functors and natural transformations to natural transformations. This characterisation is captured by the following typeclass,

class HFunctor f where

where natural transformations are defined as:

type
$$f :-> g = forall i. f i -> g i$$

In general, HFunctor should also provide a method of type, capturing the requirement that a higher-order functor maps functors to functors:

Functor
$$g \Rightarrow (a \rightarrow b) \rightarrow f g a \rightarrow f g b$$

However, as in the work of Johann and Ghani [JG08], we do not provide such a method, meaning that our higher-order functors only map type functions to type functions. This generalisation from functors to type functions is necessary in order to represent the indexed types required for augmenting expressions with their syntactic categories. For example, given a functor g, the parameterised signature Arith g is not a functor. Technically speaking, what we have defined here are higher-order endofunctors mapping types to types, with no (non-trivial) mapping of functions to functions (i.e. no fmap). In the language of Johann and Ghani, these structures map between functors of kind $|*| \rightarrow *$ (wherein |C| is shorthand for the discrete category derived from the category C [Pro00], and * refers to any ordinary Haskell type), which is precisely what is needed to represent GADTs.

Instance declarations for HFunctor are defined in a straightforward manner, akin to those for Functor. For example, we can define the State signature as a higher-order functor as follows:

```
instance HFunctor State where

hfmap f (Get v) = Get v

hfmap f (Set v x) = Set v (f x)
```

Using this structure, we can define higher-order folds. Since our signatures are now indexed (as are their fixpoints), so are the algebras that are used to define folds over them. More precisely, given a higher-order functor f and a type constructor f c: * * **, a higher-order f-algebra with carrier f c is a natural transformation of type f c: -> c. Apart from the types, the implementation of higher-order folds is identical to the implementation over typical Haskell functors:

```
foldH :: HFunctor f => (f c :-> c) -> FixH f :-> c
foldH f (InH t) = f (hfmap (foldH f) t)
```

The definition of the subsignature typeclass (:<:) is also easily lifted to the higher-order setting:

```
class (sub :: (* -> *) -> * -> *) ::< sup where
injH :: sub a :-> sup a
```

The instance declarations for (:<:) are carried over to the typeclass (::<) without surprises, producing the higher-order inject function:

```
injectH :: (g ::< f) => g (FixH f) :-> FixH f
injectH = InH . injH
```

As for signature functors, we assume that each constructor of a higher-order signature functor comes equipped with a corresponding smart constructor defined via injectH, e.g.:

Given these smart constructors, we can write the source program of Figure 6.1, which computes the factorial of the variable x. Note that this program makes use of a mulh constructor that we have omitted for brevity, however it is part of the Arith signature, and trivial to implement.

6.2.3 Well-Kinded Signature Indices

The use of empty data types such as Stmt as indices may seem crude at first glance, especially considering that the latest versions of GHC support

FIGURE 6.1: A sample program computing factorials.

the promotion of datatypes to the kind [YWC $^+12$] level. Using this new promotion mechanism, we *could* have defined the following datatypes:

```
data Idx = Exp Ty | Stmt
data Ty = IntType | BoolType
```

Using GHC's Haskell language extension DataKinds, these datatypes are promoted to the kind level, giving us the *type* constructor Exp of *kind* (Ty \rightarrow Idx). These types and kinds allow for the definition of more precise kinds for higher-order signatures: that is to say, instead of having kind $(* \rightarrow *) \rightarrow (* \rightarrow *)$, they would have kind (Idx $\rightarrow *) \rightarrow (Idx \rightarrow *)$.

The problem with using this well-kinded representation is that we lose the ability to extend the indices used in our signature functors. For example, we are no longer able to add a language feature that makes use of a 'new' type – say, natural numbers – since the type Ty (and thus the corresponding kind

via promotion) is closed. Opting instead to use empty datatypes allows us to extend the set of indices by simply defining a corresponding datatype:

data NatType

The above, for example, now allowing us to index expressions as having the type NatType of kind *.

Note that the approach of using a typeclass such as (:<:) in order to facilitate open definitions (as detailed in Chapter 4.2.2) cannot be used in order to implement an extensible signature index. For this, we would require *kind-classes*, a feature currently not supported in Haskell.

We now go on to consider the semantics for these higher-order modular source signatures, and identify the necessary alterations required in order to both make use of the indices now found within subexpressions, and extend the definitions of the evaluation algebras into a higher-order setting.

6.3 Semantics of Higher-Order

Signatures

In this section we demonstrate how the use of higher-order functors when defining source signatures requires a new modular evaluation algebra typeclass. Further, we extend the state space to an arbitrarily large key-value mapping, and as such we must reconsider the semantics of modular mutable state before we lift the signature into the higher-order setting.

6.3.1 Revisiting The State Monad

Consider a higher-order representation of State that makes use of the index labels discussed in the last section:

```
data State e 1 where
```

```
Get :: Ref -> State e IExp
```

Set :: Ref -> e IExp -> State e Stmt

In Chapter 5.3 we introduced the state monad transformer and StateMonad effect typeclass in order to define the semantics for state. The interface for a state *monad* as found in the mtl monad transformer library [Gil14] is:

```
class Monad m => MonadState s m | m -> s where
  get :: m s
  put :: s -> m ()

modify :: MonadState s m => (s -> s) -> m ()
```

modify $f = do \{x \leftarrow get; put (f x)\}$

In order to implement a state space comprising an arbitrarily large number of integer-valued variables, we use the type Map of finite mappings. The resulting type of this new state space is:

As before, in the above the mapping could just as easily target a modular Value datatype, but for clarity we do not do so here. Functions to read and write individual variables are easily implemented:

```
setRef :: MonadState St m => Ref -> Int -> m ()
setRef v n = modify (Map.insert v n)
```

In the above, note that since a variable may not yet be associated with an integer when referenced (although generally we make the assumption that we only consider closed terms), the getRef function provides a means to signal failure (alternatively, a default value can be returned in the event of

a lookup failure). For our purposes, we treat failure as an effect in the sense of an exception, and reflect this structure by the MonadPlus constraint.

6.3.2 Higher-Order Modular Semantics

Having redefined the modular source language of our compilation framework as a family of types – comprising the types for expressions and statements –, the semantic domain must also be redefined as a type family. Here we define the potential types of the semantic domain in a manner similar to the source language itself (i.e. treating the resulting values as literals, which can in turn be used to define datatypes such as Arith):

```
data VNum (e :: * -> *) 1 where
Num :: Int -> VNum e IExp

data VBool (e :: * -> *) 1 where
Bool :: Bool -> VBool e BExp

data VUnit (e :: * -> *) 1 where
Unit :: VUnit e Stmt
```

A higher-order modular semantics is defined in terms of a natural transformation, i.e. of type (f c :-> c). However, we require *more* structure

within this algebra, because the carrier c may contain both values (constructed using the above constructors) and effects invoked by any monadic methods available to the source expression. Therefore, the definition of the typeclass for the evaluation algebra is:

```
class (HFunctor f, Monad m) => AlgEv f m v where
   algEv :: f (m :o: FixH v) :-> m :o: FixH v
```

In the above, (:o:) denotes the composition of type constructors of kind $* \rightarrow *$, and is defined as follows:

```
newtype (f :o: g) i = C { unC :: f (g i) }
```

That is to say, the carrier of the evaluation algebra is the composition of a monad m with a fixpoint FixH v over a higher-order functor v describing the semantic domain. This explicit separation of the carrier into distinct components is a necessary consequence of monads composing in a different manner to fixpoints: the former is achieved via the use of monad transformers, and the latter via coproducts.

However, we make one small modification to the above definition of algEv. In its current form, the result type is a composition involving (:o:), which means that any results must be explicitly tagged with the constructor C. We choose to avoid this, and use the following definition instead:

```
class (HFunctor f, Monad m) => AlgEv f m v where
    algEv :: f (m :o: FixH v) i :-> m (FixH v i)
```

The type of the above algebra is isomorphic to the previous definition: we regain the correct algebra type by composing algEv with C:

We use this composition as the argument to foldH in order to define the desired higher-order modular evaluator:

```
eval' :: AlgEv f m v => FixH f :-> m :o: FixH v
eval' = foldH (C . algEv)
```

Finally, by composing eval' with unC, we obtain a variant that does *not* make use of the composition operator (:o:):

```
eval :: AlgEv f m v => FixH f i -> m (FixH v i)
eval = unC . eval'
```

To achieve modularity in the source signature, the typeclass AlgEv is trivially lifted over higher-order coproducts:

```
instance (AlgEv f m v, AlgEv g m v) =>
AlgEv (f +:: g) m v where
algEv (InlH x) = algEv x
algEv (InrH y) = algEv y
```

As was the case for our previously defined higher-order functors, we assume the existence of smart constructors for Num, Bool and Unit called num, bool and unit, respectively. However, at this point we also require smart destructors, as we wish to pattern match on the result of an evaluation. In order to implement such destructors, the (::<) typeclass is extended with a projection method of the following type:

```
prjH :: sup a i -> Maybe ((sub a) i)
```

In the event that the supersignature does indeed contain the subsignature in question, fromJust o prjH is both a left and right inverse of injH, coercing a value of the supersignature into a value of the subsignature, and returning Nothing if this is not possible. Instance declarations for (::<) can be easily extended to implement prjH:

```
instance HFunctor f => f ::< f where
injH = id
prjH = Just</pre>
```

```
instance (HFunctor f, HFunctor g) => f ::< (f ::+ g) where
injH = InlH
prjH (InlH x) = x
prjH (InrH y) = Nothing</pre>
```

```
instance (HFunctor f, HFunctor g, HFunctor h, f ::< h)
=> f ::< (g ::+ h) where
injH = InrH . injH
prjH (InlH x) = Nothing
prjH (InrH y) = InrH . prjH</pre>
```

With the use of this new method, we can define the smart destructor for Num as follows:

The corresponding smart destructor getBool is defined analogously. With these destructors available to us, we can finally define the higher-order semantics of the source language. The definitions are given in Appendix A. Note that the context of these instance definitions list both the monadic constraints and the value signature, keeping them open for extension as before. Since the carrier of the evaluator algebra is a composition formed using (:o:), we must pattern match on all subexpressions.

There are two points worth noting about the evaluation algebra instantiations for control structure signatures. Firstly, common to all three instances is the lack of an effect typeclass constraint, as their semantics concerns control flow only, and so any monad suffices. Secondly, we note that the body of the semantics for while-loops is recursively defined, making it more operational than denotational in nature. This is an important distinction to make given that the latter must be compositional, however we are not bound to this requirement (other than by a desire for a modular equivalent to a denotational semantics), and therefore keep in mind that the introduction of while-loops removes this property. However, those source signatures that do not contain while-loops still satisfy compositionality. Moreover, we highlight at this point that whilst non-termination is an effect unto itself (and one that can be captured using while-statements), we have chosen to limit our source expressions to terminating closed terms.

Now that we have set our framework up anew, we demonstrate its usage by way of interpreting the factorial program defined in Figure 6.1.

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6.3.3 Modular Semantics: An Example

Recall the type signature of the modular evaluation function:

```
eval :: AlgEv f m v => FixH f i -> m (FixH v i)
```

This type signature tells us that the result of interpreting a modular source expression will have type m (FixH v i) for some appropriate monad m and semantic domain v. Because it is the monad that allows access to the requisite effectful methods, the signature of a given source program provides information about the requisite candidate monads within which it can be interpreted. Likewise, a suitable semantic domain can also be inferred in this manner. We will demonstrate this idea below.

Recall the type signature of fac:

fac :: FixH FacLang Stmt

From the above signature alone, we can sketch a complete picture of the type of monads and semantic domains needed to evaluate this particular program. We do this by accumulating the constraints upon each of the five language features, according to the instance declarations given in Appendix A. For clarity, we list the relevant signatures below:

Upon inspection, we conclude that we can interpret fac within the context of any monad m provided that it is also an instance of the MonadState St and MonadPlus typeclasses. Likewise, we find that an appropriate semantic domain — abusing terminology somewhat, as we do not require a bottom element since we do not incorporate non-termination — is the fixpoint of a higher-order signature functor v that contains at least VNum, VBool and VUnit. Note that we have done this without even looking at the body of the source program itself!

For this example, we obtain a suitable monad for our purposes by applying the state monad transformer – with state space St – to the Maybe monad:

```
type FacMonad = StateT St Maybe
```

The semantic domain is obtained by capturing all value types referenced in the constraints of the required evaluation algebras. Here, we have invoked the Stmt syntactic category so as to match the type of fac, but in practice any syntactic category can be used):

```
type FacValue = FixH (VNum ::+ VBool ::+ VUnit) Stmt
```

The evaluator for the language of the fac program is now obtained by instantiating the modular eval function with its modular context (the monad) and modular semantic domain:

```
evalFac :: FixH FacLang Stmt -> FacMonad FacValue
evalFac = eval
```

We can now define our modular factorial function by evaluating fac and running the resulting state computation with the initial state map

[(x, n)], recalling that fac associates its argument with x:

```
runFac :: Int -> Maybe (Value, St)
runFac n = runS (evalL1 fac) (fromList [(x, n)])
```

We test the function with input 10:

```
-- x = Ref "x"

-- y = Ref "y"

> runFac 10

Just (Unit, fromList [(x, 0), (y, 3628800)])
```

As expected, the variable y is bound to the value 3,628,800. The actual return value of running the program, however, is Unit, which is expected as we declared fac to be a Stmt in its signature.

6.4 Further Refining Modular Compilers

Having treated the source language representation of our new framework in depth, we move on to consider the representation of the target language in light of the presence of the control-flow features introduced. Whilst the target language defined in Chapter 5.1 incorporates a simple notion of control flow in the form of exceptions, the target languages required when compiling these new signatures must necessarily allow for *cyclic* control flow. For instance, the factorial program illustrated in Figure 6.1 is inherently cyclic. The cyclicity of a source program must be reflected in the code produced by

a compiler, and this is typically achieved by making use of a graph structure

using explicit jumps and labels. However, in this thesis we will make use of the purely functional representation of graphs proposed by Oliveira and Cook dubbed *structured graphs* [OC12], which provide a representation of term graphs, using an elegant encoding of sharing and cyclicity via *parametric higher-order abstract syntax* [Chl08]. This representation provides a simple interface for constructing graphs in a compositional fashion, at the cost of a more complicated and restrictive interface for their consumption, as we shall see shortly.

6.4.1 From Fixpoints To Graphs

The idea of structured graphs is to represent term graphs – graphs wherein vertices denote subterms – via mutually recursive let-bindings. The definition of structured graphs that we make use of extends the definition of the least-fixpoint construct by including two additional constructors, Var and Mu for representing variables and mutually recursive bindings:

The newly-added parameter v defines the type for the metavariables in the graph. We are already familiar with the notion of the InG constructor,

as it is equivalent to the In constructor for fixpoints. The Mu constructor represents binders using higher-order abstract syntax (HOAS). In order to enable mutually recursive bindings, we define Mu as a function taking a list of metavariables and returning a list of associated term graphs. The simplest way to explain the intended semantics of Mu is to show how it corresponds to the let-binding notation of Haskell. Specifically, a let-binding that takes the form –

let
$$x1 = b1$$
; $x2 = b2$; ...; $xn = bn$ in b

- is represented as a structured graph as follows:

Mu (\[_, x1, x2, ..., xn]
$$\rightarrow$$
 [b, b1, b2, ..., bn])

More specifically, the function associated with the Mu constructor takes the list of bound metavariables as arguments, and returns a list of the same length such that the i^{th} element of that list is bound to the i^{th} metavariable from the input list. The first element of the return list, b, is the entry point of the graph. In addition, we choose to represent the metavariable list passed to Mu as an *irrefutable pattern*:

In brief, we have made the list of metavariables into a lazy pattern, meaning that all matches immediately succeed. Such patterns are only matched against – and in our case, the metavariables in question looked up – if a variable contained within is needed on the right-hand side of the function, creating a more general and less strict setting for modelling cyclic computation. In this thesis, we shall only use two special cases of the Mu constructor, namely non-recursive let bindings and fixpoints over a single argument:

```
letx :: GraphT f v -> (v -> GraphT f v) -> GraphT f v
letx g f = Mu (\~(_ : x : _) -> [f x, g])
mu :: (v -> GraphT f v) -> GraphT f v
mu f = Mu (\~(x : _) -> [f x])
```

Using these combinators, within our framework we represent non-recursive let-bindings of the form (let x = b in s) as (letx + b ($\lambda x + b$), and a least-fixpoint Fix f as mu f.

As mentioned at the beginning of this section, structured graphs make use of a restricted form of HOAS called *parametric* HOAS. When constructing structured graphs, the type v of metavariables is left polymorphic. To ensure this, structured graphs of type GraphT are wrapped in the newtype Graph, which enforces the parametric polymorphism of v:

The parametricity of v ensures that it is only used to define binders within the graph. Moreover, parametricity is used when defining recursion schemes on structured graphs. The recursion schemes we use here operate similarly to the usual fold operator on fixpoints. One particularly general recursion scheme over graphs is defined below:

In contrast to fold, gfold takes two additional arguments corresponding to the actions to be taken for the Var and Mu constructors. The first argument, of type (t \rightarrow c), is used to transform metavariables into the result type c. The second argument, of type ([t] \rightarrow [c]) \rightarrow c, is used to interpret mutually recursive binders, where the right-hand side of each binding has already been transformed.

In analogy to the fixpoint type constructor Fix, smart constructors simplify graph construction. We transcribe inject from fixpoints to graphs below:

```
injectG :: (f :<: g) => f (GraphT g a) -> GraphT g a
injectG = InG . inj
```

Using injectG, we obtain smart constructors such as the following:

```
pushG :: (ARITH :<: f) => Int -> GraphT f v -> GraphT f v
pushG n c = injectG (PUSH n c)
```

Note that the structured graphs that we have defined above make use of standard functors as opposed to the higher-order variant introduced in this chapter (i.e. there is only one syntactic category used within the code), even though building graph types based on higher-order functors is possible, as shown by Oliveira and Löh [OL13]. However for the purpose of representing control-flow graphs, this is not necessary. The potential for a more richly typed target language has many applications, such as using types to encode invariants about the current state of a stack (see, for example, McKinna and Wright [MW06]), but this is an orthogonal issue and will not be discussed further here.

6.4.2 Compiling To Structured Graphs

At this point we can refactor the carrier of the modular compilation algebra typeclass to reflect the usage of structured graphs instead of least fixpoints:

It is important to note that as well as shifting to a graph structure to represent target code, the syntax of the various source language features are now represented as higher-order functors in order to include information about syntactic categories. However, because the target language remains untyped – and is represented via standard functors – we use the type constructor K to forget the type information from the source language:

```
newtype K a i = K { unK :: a }

class (HFunctor f) => AlgCoG f g where
  algCoG :: f (K (GraphT g v -> GraphT g v))
    :-> K (GraphT g v -> GraphT g v)
```

Finally, we repeat the type manipulations of Chapter 6.3.2 to eliminate the type constructor K in the result type, producing the following (final) definition of the higher-order compilation algebra typeclass:

To obtain an algebra of the correct type, we compose algCoG with K:

As before, this typeclass is easily lifted to coproducts:

```
instance (AlgCoG f g, AlgCoG h g) =>
AlgCoG (f +:: h) g where
algCoG (InlH x) = algCoG x
algCoG (InrH y) = algCoG y
```

Note that we have been using the GraphT type constructor, instead of the encapsulated Graph variant. As a rule, the manipulations involving GraphT are passed on to MkGraph to construct a graph of type Graph g. The type of MkGraph — a rank-2 polymorphic constructor — ensures that the underlying graph is indeed polymorphic in the type v of metavariables:

```
comp :: (AlgCoG f g, HALT :<: g) => FixH f i -> Graph g
comp e = MkGraph (unK (foldH (K . algCoG) e) haltG)
```

Here we use unK to turn the result of the fold, which is of type K (GraphT $g\ v \to GraphT\ g\ v)$ i, into a function of type (GraphT $g\ v \to GraphT$ $g\ v)$. This function is then applied to a singleton HALT instruction which

serves as the final code continuation. The implementation of the new compilation algebra instance for arithmetic is analogous to the version defined via standard least-fixpoints in Chapter 5.1:

The (|>) constructor used above is simply a graph-specific variant of the function application operator (\$). Furthermore, because we are compiling into a graph structure, we make use of the smart constructors for graphs, and because the carrier of the algebra is wrapped in the type constructor K, we pattern match argument subexpressions against K.

When defining the algebra instance for the higher-order exceptions signature, we can now exploit the sharing capabilities afforded to us by the newfound target graph structure:

Instead of placing the continuation c directly into the generated code (thereby duplicating c and wasting memory on an uninvoked thunk), we

choose to bind c to the metavariable v and refer to *this* instead of c, eliminating the risk of code duplication. The same approach is used to compile *if*-statements, with the aid of a conditional jump instruction:

The JPC instruction removes the topmost element from the stack and inspects it, executing its first argument (and skipping the second) if this value is True, and skipping the first argument and executing the second argument otherwise. In a manner similar to MARK, JPC has the potential for code duplication when joining the execution paths of the conditional. We avoid this duplication using letx as before:

We also make significant usage of this new graph structure when compiling loops, as we must construct cycles in the target code. For this, we make use of the mu combinator defined earlier:

Next, we define the algebras for both the State and Comp signatures. These require corresponding target instructions:

The semantics of the instructions for the STATE signature above are identical to the variant presented in Chapter 5.3, albeit operating over a larger state space. The instructions of the COMP signature take the topmost two integers from the stack, and replace them with the appropriate Boolean value. The instance declarations themselves are defined thus:

Finally, the algebra instance for compiling sequential composition:

To see the compiler thus defined in action, we apply it to the example source program from Figure 6.1. Firstly, we specialise the source and target languages in the manner described in Chapter 6.3.3. We note that here the constraints which must be adhered to are fewer, as we need not consider monadic effects. We only consider target language requirements:

The type system of Haskell will ensure that the target language contains the necessary instruction set to compile the source language. If, for example, we were to forget to include the COMP signature as a component of the target language FacLangG, the typechecker would produce:

```
No instance for (COMP :<: HALT) arising from a use of 'comp'.
```

Applying compFacG to fac returns the following (pretty-printed) graph:

```
> compFacG fac
PUSH 1; SET y; [v1 -> PUSH 0; GET x; LT;
JPC (GET y; GET x; MUL; SET y; GET x;
```

PUSH (-1); ADD; SET x; v1); HALT]

The code inside the square brackets corresponds to bindings in the graph structure constructed using Mu. As expected, the output code graph has a single cycle, corresponding to the loop of the source program.

6.5 Modifying Existing Language Features

Recall that the compilation of exceptions makes use of the instructions MARK and UNMARK, which place handler code onto the stack and removes it respectively. This scheme is very general, allowing exceptions to be compiled within a language when the context of a *throw*-statement is not statically known. However, if we assume that we are working within the context of the language features considered in this thesis, then we know for each occurrence of a throw-statement which exception handler is associated with it. It is a simple matter to define an alternative compilation scheme that exploits this property, using the following target signature:

data EXCEPT' e = THROW' e | UNMARK' e | MARK' e

Note in the above that MARK' only has *one* argument, as we do not pass the handler code to it. Instead, the handler is passed directly to the THROW' instruction. We cannot compile the source signature Except into EXCEPT'

using the AlgCoG compilation algebra class, as this latest formulation requires that we extend the carrier with the handler currently in scope:

```
type Triple a = a -> a -> a

class AlgCoG' f g where

algCoG' :: f (K (Triple (GraphT g v))) 1

-> Triple (GraphT g v)
```

To run a modular compilation function that invokes this variant of compiling exceptions, we must supply an initial exception handler. For simplicity, we opt for the smart constructor haltG:

```
comp' :: (HFunctor f, AlgCoG' f g, HALT :<: g)
    => FixH f i -> Graph g
comp' e = MkGraph (unK (foldH (K . algCoG') e) haltG haltG)
```

Thankfully, we do not have to redefine the compilation algebra instances for those language features unaffected by this change, as we can map directly from the original algebra typeclass AlgCoG into the modified class AlgCoG', with only the Except source signature itself requiring redefinition:

```
instance AlgCoG f g => AlgCoG' f g where
algCoG' x h c =
```

```
algCoG (hfmap (K . (\f -> f h) . unK) x) c
```

One last point to note here is that whilst we have focussed on the adaptations to the types involved in the switch from fixpoints to graphs, existing concerns such as correctly compiling source expressions in light of noncommutative effects still hold. To this end, the techniques demonstrated in Chapter 5.3.2 for monadic parameterisation are equally applicable here.

6.6 Chapter Summary

The final component required for a complete definition of our modular compilation framework is the semantics of the modular target languages themselves: modular variants of virtual machines. Before we begin discussing these, however, we give a summary of the work presented above.

In this chapter, we:

- Eliminated a class of ill-typed imperative programs by using a typed representation of source signatures using Johann and Ghani's fixpoint representation of generalised algebraic datatypes.
- Refactored the target languages of our modular framework to make use of Oliveira and Cook's structured graph representation.
- Demonstrated that the additional structure provided by structured graphs allows us to compile *non*-cyclic control structures such as conditionals in a way that eliminates code duplication.
- Showed that the graph representation also allows for the sensible compilation of cyclic control structures such as while-loops.
- Showed how the compilation schemes for individual features can be redesigned, and that if necessary existing compilation typeclasses can be mapped into modified variants.

Chapter 7

Modular Virtual Machines

7.1 Virtual Machines

The final semantic component of our modular compilation framework is that of a virtual machine which executes a semantics of the target language. For our purposes, this chapter is primarily concerned with demonstrating that the same techniques of modular function construction can be used to define modular semantics for both source and target languages, be they represented via least-fixpoints or structured graphs.

In Chapter 3, we presented two variants of a CPS-style nonmodular execution function. The first, which considered only arithmetic, has type $Code \rightarrow Stack \rightarrow Stack$ for some appropriate datatype Stack, whilst the second has type $Code \rightarrow Stack \rightarrow Maybe Stack$ to account for the new

possibility of an uncaught exception. Generalising from this, our modular variant might well have type $Code \rightarrow Stack \rightarrow m$ Stack for an arbitrary monad m. We observe that since $Stack \rightarrow m$ Stack is a state transformer, a naive first implementation may have type:

```
type StackT m a = StateT Stack m a
```

```
class (Monad m, Functor f) => Exec f m where
  exAlg :: f (StackT m ()) -> StackT m ()
```

In the above, StackT is a type synonym for a state transformer parameterised over the aforementioned Stack datatype. Within the execution algebra itself, we instantiate the metavariable of StackT to the void result type (), indicating that following execution we are interested in the value of the Stack rather than any potential result value.

7.1.1 In Defence of Non-Modular Stacks

At this point, we make the design choice of using a non-modular representation – i.e. standard Haskell lists – of the stack for the purposes of clarity. The purpose of this subsection is to demonstrate why we do this, by considering the alternative and assuming that we have implemented the stack of a virtual machine operating over arithmetic as the following:

```
data Integer e = Intgr Int e

data Null e = Null

type ModularStack = Fix (Integer :+: Null)
```

The intuitive instantiation of the naive execution algebra above for the ARITH functor which uses this stack representation is:

```
instance (Monad m) => Exec ARITH m where
exAlg (PUSH n st) = pushint n >> st
exAlg (ADD st) = addstack >> st
```

The intended meaning of the above should be evident from a first reading, but contains subtleties due to the fact that the algebra carrier is defined as a state transformer. Specifically, the pushint and addstack operations produce state transformers which are anonymously composed (recall that the result type is always ()) with the continuation state transformer st.

Whilst the above appears straightforward, consider the underlying implementation. In contrast with the usage of least-fixpoints for the representation of the target language of our modular compilation algebra – wherein we are only interested in *building up* final results from an initial continuation – when using the same structure for a stack we are interested in the potential to inspect values at specific locations. As such, we must define

modular variants of combinators we take for granted when working with typical lists:

```
class Functor f => ModularList f where
```

modHead :: f (Fix f) -> Fix f

modTail :: f (Fix f) -> Fix f

We note two points in the above: that taking the head of a modular list returns a least fixpoint - this is due to the fact that modular stack constructors are also parameterised by their continuations. As such, when taking the head of a list, we simply prepend the result to an empty stack. For the sake of brevity, we will not define the instantiations of the Integer and Null functors for this class, as they are trivial to implement. Suffice it to say, the amount of such boilerplate required quickly becomes prohibitive, exceeding the size of the program implementing the modular execution algebra itself. The smart constructors for both injecting an integer value into a stack and updating the stack transformer computation appropriately are defined as follows:

```
intgr n st = inject $ Intgr n st
pushval n = update (\st -> intgr n st) >> return ()
```

In contrast, the definition of addstack is complicated by the inability to efficiently pattern-match on our modular representation of a stack:

```
addstack st = let (Just n) = getInt (modHead st)

st' = modTail st

(Just m) = getInt (modHead st')

st'' = modTail st''

in intgr (n + m) st''
```

The above assumes that we have access to a smart destructor getInt similar in nature to getNum as defined in Chapter 6.3.2.

At this point, we declare that whilst defining a modular execution algebra using modular auxiliary datatypes such as stacks *is* indeed possible, we do not consider doing so instructive, as the code required to implement the required combinators both detracts from the main aims of the chapter and is – in our opinion – not worthwhile in terms of utility gained. As such, for the rest of this chapter we will treat Stack and other such constructs as standard Haskell lists of typical ADTs.

7.2 Executing Structured Graphs

In light of the above subsection, we will be operating over a non-modular version of a virtual machine. In conjunction with a stack representation, we also require access to the key-value map St originally introduced in

Chapter 6.3.1. Thus, we refer to the collection of auxiliary datatypes which make up the representation of a virtual machine as the *configuration*:

```
type St = Map Ref Int
type Stack = [Elem]
type Conf = (Stack, St)
```

We could well inculcate St into the definition of Stack, pushing the values associated with variables onto the stack as soon as they are introduced, and searching through the stack to update them whenever necessary. However, such an update operation would be O(n) in the length of the stack, rather than O(1) when using St. As such, we opt for the above tuple representation instead.

Having decided that key-value pairs are recorded externally to the stack, we must decide what *can* appear on the stack. We define the datatype of stack elements Elem as follows:

There are two points to note about the definition. Firstly, the execution of exception-handling constructs introduces mutual recursion between the definitions of the stack and the virtual machine configuration via the argument to the HAN constructor. Secondly, we will see in the next subsection

how the (currently unused) constructor HAN' can be used to factor out this mutual recursion by compiling exceptions with respect to an alternative compilation scheme.

Now that we have chosen the representation of the virtual machine, we must decide upon the definition of the execution function over structured graphs. Given this graph structure, we can describe the aspects related to cyclicity and sharing – as identified in Chapter 6.4.1 – separate to the core semantics, which can be viewed simply as a tree structure. Recall the type signature of the most general type of fold applicable to structured graphs:

We note that the first two arguments of gfold do not fit into the general structure of the modular functions we have seen up to this point, and further highlight that these arguments correspond to the treatment of sharing and cyclicity respectively. Consider the following typeclass definition of the execution algebra, using $Conf \rightarrow Conf$ as the semantic domain:

The above algebra fits into gfold as its third argument, handling the definition of the core semantics. For the other two cases (i.e. where the

argument to gfold is a Var or Mu constructor) we unravel the graph structure and fold over the resulting tree using exAlg. This recursion scheme is the underlying intuition of the cfold combinator [OC12]:

```
cfold :: Functor f => (f t -> t) -> Graph t -> t
cfold = gfold id (head . fix)
  where fix :: (a -> a) -> a
    fix f = let r = f r in r
```

This cyclic fold combinator turns each Mu in a graph into a fixpoint computation, which corresponds to the intuition above. Given this combinator, we define the modular execution function of the virtual machine as follows:

```
exec :: (Functor f, Exec f) => Graph f -> Conf -> Conf
exec = cfold exAlg
```

The instantiations of the underlying execution algebra appear together in Appendix B, and are fairly straightforward in their definitions.

The observant will note that we have not yet made any reference to the execution of modular lambda-calculus terms as introduced in Chapter 5.2.3. The reason for this is that we have not yet described either the semantics of the target machines we seek to emulate, or the auxiliary data structures required to implement them, however both points will be addressed in Chapter 7.4.

7.3 Modifying Language Features

Recall from Chapter 4.3 that exception handlers are compiled via the two stack instructions MARK and UNMARK, which respectively place a handler onto the stack and remove it. This compilation scheme is very general, as it allows for the compilation of exceptions for a language where the context of a throw-statement is not statically known. However, if we know precisely which exception handler is associated with each occurrence of throw – which is the case in the presence of all of the features that we have introduced within this thesis–, we can define an alternative compilation scheme that exploits this property. Consider the following representation of the EXCEPT signature functor:

```
data EXCEPT' e = THROW' e | MARK' e | UNMARK' e
```

Note that MARK' only has *one* argument, as it is not provided with handler code. Instead, the handler code is given to the THROW' instruction. The execution semantics of the new instructions follow:

```
instance Exec EXCEPT' where
exAlg (THROW' c) (k, s)
= unwind' c (k, s)
exAlg (MARK' c) (k, s)
```

```
= c (HAN' : k, s)
exAlg (UNMARK' c) (e : HAN' : k, s)
= c (e : k, s)

unwind' c (HAN' : k, s) = c (k, s)
unwind' c (_ : k, s) = unwind' c (k, s)
unwind' c ([], s) = ([], s)
```

We cannot compile the source signature Except into this modified target signature EXCEPT' using the original compilation algebra typeclass Comp.

To do this, we require a slight variation of the compilation algebra:

The additional GraphT g v argument in the carrier represents the exception handler that is currently in scope. For simplicity, we pick HALT as the initial exception handler:

```
comp' :: (AlgCoG' f, HALT :<: g) => FixH f i -> Graph g
comp' e = MkGraph (unK (foldH (K . algCoG') e) haltG haltG)
```

However, we do not have to redefine compilation algebras for features that are not affected by this change, as we can embed the existing definitions from AlgCoG into AlgCoG'. The only feature requiring redefinition is Except, as it is directly affected:

We now turn our attention to describing how terms within both modular variants of the lambda calculus – as introduced in Chapter 6 – fit into this execution framework.

7.4 The Operational Semantics of the λ -Calculi

As mentioned in Chapter 5.2.3, a more operational explanation of the modular representations and compilation schemes implementing the call-byvalue and call-by-name recursion schemes is required. In this section, we define their operational semantics and their execution algebra implementations.

Recalling the compilation schemes $\mathbb{C}(\mathsf{t})$ for the Categorical Abstract Machine and $\mathbb{K}(\mathsf{t})$ for the Krivine machine from Chapter 5.2.3, tables 7.1 and 7.2 below describe the operational semantics of both machines in terms of transformations over a tuple consisting of an environment and a heap:

Code		Env	Heap		\mathbf{Code}	Env	Heap
IND n ;	c	e	h	\rightarrow	c	e	(e !! n); h
CLS k;	c	e	h	\rightarrow	c	e	[k, e]; h
APP;	c	e	v; [d, f]; h	\rightarrow	d	v; f	c; e; h
RET;	c	e	v; d; f; h	\rightarrow	d	f	v; h

Table 7.1: Call-by-Value Operational Semantics for the Categorical Abstract Machine

The notation $[c, \mathbf{e}]$ used by both of these tables is shorthand for a closure consisting of a code fragment c and current environment \mathbf{e} . Looking at the instructions for the CAM in Table 7.1, we highlight the fact that variable lookup corresponds simply to indexing into the environment via the de-Bruijn index (corresponding to the number of binders that must

be 'jumped' over to reach the appropriate binding site), and function application is performed by reducing both the function to a closure and the argument to a value, and then calling the code fragment of the closure with the associated environment updated with the argument value.

When considering the instructions for the Krivine machine of Table 7.2, the heap represents the spine of the lambda-term being executed, and we note in particular that β -reduction is performed by calling GRAB.

Code		Env	Heap		Code	Env	Heap
ACS 0;	c	$[d, \mathbf{f}]; \mathbf{e}$	h	\rightarrow	d	f	h
ACS (n + 1);	c	$[d, \mathbf{f}]; \mathbf{e}$	h	\rightarrow	ACS $n; c$	e	h
GRAB;	c	e	$[d, \mathbf{f}]; \mathbf{h}$	\rightarrow	c	$[d, \mathbf{f}]; \mathbf{e}$	h
PSH c' ;	c	e	h	\rightarrow	c	e	[c'; e]; h

Table 7.2: Call-by-Name Operational Semantics for the Krivine Machine

The transitions in the above tables directly inform the definitions of the datatypes used by our virtual machine to implement both schemes:

class ExecLC f where

We state at this point that we are defining the auxiliary datatypes for the implementation of the lambda-calculi separate to the stack and variable map defined for all of the other features we have discussed up until this point. Whilst they could be inculcated into the existing structures – in much the same way as the variable map could be merged into the stack – we make this decision as a separation of concerns, and to clarify the semantics. This new typeclass ExecLC accounts for the fact that the lambda calculus makes exclusive use of Heap and Env.

As an aside, whilst terms in the lambda calculus do not make use of either Stack or St, we include them both in the updated configuration LConf above so that they can be accessed by other features when being executed, the details of which we shall see shortly. The instances of ExecLC implementing both evaluation schemes for the lambda calculus follow:

instance ExecLC LAMBDAV where

instance ExecLC LAMBDAN where

Given that we have already defined a number of execution algebras over an existing configuration, instead of redefining them over the richer configuration associated with the execution of lambda-calculus terms, we repeat the technique used in Chapter 7.3 of embedding one typeclass into another:

The above instance minimises the need to write duplicate code wherein the only changes required add dummy variables to the configuration.

7.5 Chapter Summary

The end of this chapter represents the conclusion of the presentation of our modular compilation framework. Whilst we discuss the impact and future research potential of this work as a whole in the next (and final) chapter, the salient points of *this* chapter are:

- We justify our representation of the current configuration of a modular virtual machine as a tuple of non-modular lists as being both simpler to comprehend and as a reduction of necessary boilerplate.
- We show how features that are compiled via distinct schemes may necessitate distinct execution algebra carriers, and furthermore, demonstrate how embeddings between execution algebras can eliminate the need to rewrite code that is unaffected.
- We present the operational semantics of two implementations of the lambda calculus – namely the Categorical Abstract Machine and Krivine's machine – in table form, and then implement both as instances of a new execution algebra with an extended carrier, defining an embedding between the two.

Chapter 8

Discussion & Conclusion

To conclude, this final chapter presents a general overview of the thesis and a discussion on both its motivation and to what extent it has succeeded in its original aims, as well as a number of directions for future work.

8.1 Retrospection

The desire to construct compilers that are provably correct in a systemic manner has existed since the 1950s. This thesis is itself the third in a trilogy under Graham Hutton; the first being that of Joel Wright on compiling and reasoning about exceptions and interrupts [Wri05], published in 2005,

and the second being that of Liyang Hu, treating the compilation of concurrency in a correct manner via a verified software transactional memory model [Hu12], published in 2012.

My own work on this topic began in 2010, with my original goal being to develop a compiler over a modularised variant of a language based upon Hutton's Razor, as presented in Chapter 4. The intention was that each constituent feature could be proved correct in the style of Wright, and the combination of these proofs would itself constitute a proof for the compound language. However, it was quickly realised that the truly interesting material lay in the interactions between features themselves, not necessarily the proofs that they were being compiled in a sane manner. With that said, such a proof technique would go a long way towards motivating the usage of the ideas we have presented as an alternative to the deep embedding of DSLs such as Functional MetaPost [Hob15]. As it stands, the framework we have developed is currently best suited to exploring the requirements placed on source expressions for experimental DSLs.

The discovery that a program containing a given set of features may be compiled into different instruction sets (Chapter 5) depending on its intended semantics was a direct consequence of the shortcomings of the monad transformer approach of Haskell. Notably, the first two techniques which we present to permit the compilation of noncommutative effects were borne from a desire to produce a working solution from the monad transformer

approach itself, and the subsequent realisation that we were simply patternmatching upon the type constructors of the transformer stack. These techniques are themselves subject to modularity concerns (concerning the presence of commutative intermediate transformers), but are intended as an alleviation, not a cure.

Attempts to construct source programs which could act as running examples for our framework highlighted the need to introduce syntax associated with control-flow (Chapter 6). By doing so, the desire for syntactic categories within source syntax and a target representation capable of supporting cyclicity arose, and hence justified the presence of higher-order source functors and structured graphs.

Finally, the work on constructing modular virtual machines (Chapter 7) is intended primarily as a mechanism for establishing the equivalence between terms that been evaluated, and compiled and executed. Whilst the presence of the virtual machine was originally attributed to the desire to construct inductive proofs of correctness à la Wright, the algebras for the lambda calculus prove interesting reading. The initial approach we took to virtual machines – that they are simply computations producing state transformers – proved useful in that we have adapted it into the justification for non-modular auxiliary datatypes. Further, this initial approach led us to the decision that monads should not appear within virtual machine carriers, as we use them solely to manifest and describe effectful operations.

The thesis as a whole concerns the piecemeal definition and construction of functions that manipulate syntax trees, with particular emphasis on the relationships between syntax drawn from distinct features. We have merged together the seminal work on modular monadic semantics [LHJ95b], the datatypes à la carte technique for extensible datatypes (alongside showing how this technique can support multi-sortedness), and Haskell's rich static type system to form a novel framework allowing for a denotational semantics, operational semantics or syntactic transformation to be defined for a language in an easily-composable manner. By introducing the languages in question as representing the features that can be invoked by a programming language, we have been able to scale up from trivial examples (arithmetic) to treatments of features with fully-fledged associated fields of research behind them (the lambda calculus).

Our final result is a set of features which, when combined, corresponds to a substantially expressive source language. Associated with this language is a fully defined, intuitive semantics that can be inspected on a per-feature basis. In addition, we present a schema for transforming programs from the source language into a target language consisting of stack-based instructions. However, we are not fixed in this choice of target: we have, for example, been able to successfully target the graph representation of the Hoopl dataflow analysis library [RDPJ10] in the same manner. To our knowledge, this technique of transforming syntax piecemeal alongside the

ability to produce different results according to the presence and ordering of certain features is unique.

8.2 Potential Future Research Directions

To reiterate the claim we made at the end of Chapter 3, the compilation of EDSLs in a modular manner is a particularly rich source topic, and whilst we are satisfied that the work presented by this thesis constitutes a novel and powerful set of techniques for manipulating both the syntax and semantics of the source and target languages associated with a given EDSL, there is no shortage of ways in which such a framework can be improved upon. In particular, the question of what exactly would be required for this approach to 'scale up' to a production quality DSL compiler (or a general compiler) is worth considering, requiring as it were a far more formal specification of the range of types and constructors available for source, target and execution algebras. In this subsection, we list a number of additional avenues that we feel are worthy of future consideration.

Additional Computational Features: extending our framework with support for additional features is a project that holds significant potential, as there will always be 'something else' that might make an ideal candidate for integration. In particular, we would be interested in seeing the introduction of other forms of control flow such as continuations, explicit parallelism and I/O, as well as any domain-specific features unique to the DSL we wish to introduce (most likely to present as combinations of the former with those we have introduced in this thesis). Furthermore, the recursion schemes used to define the compiler and the language semantics can be extended: more structured recursion schemes derived from tree automata [Bah12, BD13] and attribute grammars [VS12] offer more freedom to replace parts of a given modular definition as opposed to only being able to extend them. In the same direction goes the work of Kimmell et al. [KKA05] and Frisby et al. [WKFA] which introduce algebra combinators such as switch and sequence to compose algebras. Finally, it would be interesting to investigate how one might exploit the algebraic theory of effects to give a principled understanding of the complexity involved in integrating a new feature based upon the effectful methods it provides.

Attribute Grammars: The Utrecht University Attribute Grammar Compiler (UUAGC) [SAS+99] is a Haskell preprocessor which simplifies the construction of catamorphisms over tree-like structures. Moreover, the UUAGC supports open data types and functions, providing an excellent foundation for modular programming. Future investigation into the extent to which the UUAGC system is suitable for further highlighting the independence of individual signature functors and their associated semantics appears promising. There are also a number of standalone attribute grammar systems with particular focus on extensible language implementation

such as LISA [MU05], JastAdd [EH07] and Silver [VWBGK08].

Modular Syntax: As identified in Chapter 6.2.1, the usage of higher-order functors to represent indexed datatypes and families of mutually recursive datatypes stems from Johann and Ghani [JG08], however Yakushev et al. [YHLJ09] also applied this technique to generic programming. Axelsson [Axe12] introduces a different approach to modular well-typed definitions of syntax and semantics: said work develops an applicative encoding of syntax making heavy use of type indexing to describe the signature of individual language features.

Indexed Type Families: In Haskell, the indexed type family extension [CKJM05], which permits ad-hoc overloading of datatypes, may prove useful in explicitly declaring a link between the signature functors of a source and target language for a particular effect. For example, in Chapter 4.3 we defined an evaluation algebra mapping terms constructed from the source functor Arith into terms constructed from the target functor ARITH. At present, we are capable of compiling into any target language, provided it supports the requisite signatures. Declaring a type family with a functional dependency in order to define a mapping from a source language FixH f i to a target language Graph (Target f) may ensure the target language is minimal, removing the requirement that the user pre-defines the target language.

Automatic Context Inference: An observation ¹ that arose during my research is that it may be possible to use the ordering of signature functors in the type of a source expression to automatically infer the monadic context within which we wish to evaluate it. For example, given a term with signature (Arith ::+ Except ::+ State), one might infer that it is to be evaluated within a monad built up from the identity monad – corresponding to Arith – by first applying the exception transformer, and then applying the state monad transformer. Such an interpretation could prove to be useful as a method of providing a default behaviour, which a user can override if they wish. With that said, further differentiation would likely be required if, for example, a state-carrying signature appeared twice (perhaps both before and after an exception-based signature).

Alternative Target Languages: As presented in this thesis, we compile into a stack-based language. It would be useful to consider how our framework can be adapted to other forms of target language, in particular register-based languages such as LLVM [LA04], which can be used as the target language for many imperative language compilers or logic-based languages such as System F [Rey74], a variant of which is used by GHC.

Dataflow Analysis and Optimisations: A natural extension of our work is the implementation of dataflow analysis and optimisations in a modular style. A good starting point for extending our work in this direction is

¹Personal Communication: Wouter Swierstra, March 2013

Hoopl, the Higher Order Optimisation Library of Ramsey et al. [RDPJ10]. Hoopl is a Haskell library that allows compiler representations to define dataflow analyses and implement optimising transformations that are informed by said analyses. Modular implementations of optimising transformations can be achieved using the same techniques as presented in this thesis. However, as mentioned in the previous subsection, we have observed that dataflow analysis and the underlying lattice structures can be defined in a modular manner for – at least – standard textbook analyses.

Testing and Reasoning: An important property of a compiler is its trust-worthiness. Does it perform only semantics preserving transformations? Establishing such trustworthiness in a modular fashion remains a considerably challenge. However, using the same techniques as presented here, automatic test case generation (i.e. generation of input programs and initial configurations) can be implemented in a modular fashion. Rigorous and machine-checked correctness proofs, however, require new reasoning techniques that work in a modular setting. There is growing interest in formalising programming language metatheory in a modular fashion [DdSOS13, DKSO13, SS13]. However, the process in of building modular proofs of compiler correctness includes several additional difficulties. Such proofs must be modular along both the source and target languages as well as its computational effects. As the work of Delaware et al. [DdSOS13]

shows, modular reasoning about effects already becomes a considerable obstacle for type soundness proofs.

Appendix A:

Higher-Order

Evaluation Algebras

```
instance (AlgEv f m v, AlgEv g m v) => AlgEv (f :+: g) m v where
   algEv (Inl x) = algEv x
   algEv (Inr y) = algEv y

instance (Monad m, VNum ::< v) =>
AlgEv Arith m v where
   algEv (Val n) = return (num n)
   algEv (Add (C x) (C y)) = do
   Just n <- liftM getNum x
   Just m <- liftM getNum y
   return (num (n + m))</pre>
```

```
instance Monad m => AlgEv Seq m v where
  algEv (Seq (C x) (C y)) = x >> y
instance (Monad m, VNum ::< v, VBool ::< v) =>
 AlgEv Comp m v where
  algEv (Equ (C x) (C y)) = do
   Just n <- liftM getNum x</pre>
       Just m <- liftM getNum y</pre>
       return (bool (n == m))
  algEv (Lt (C x) (C y)) = do
       Just n <- liftM getNum x</pre>
       Just m <- liftM getNum y</pre>
       return (bool (n < m))
instance MonadPlus m =>
 AlgEv Except m v where
 algEv (Throw)
                             = mzero
  algEv (Catch (C x) (C h)) = x 'mplus' h
```

```
instance (MonadPlus m, MonadState St m,
VNum ::< v, VUnit ::< v) =>
AlgEv State m v where
  algEv (Get v)
       liftM num (getRef v)
  algEv (Set v (C m)) =
       liftM getNum m >>= \(Just n) ->
       setRef v n >> return unit
instance (Monad m, VBool ::< v, VUnit ::< v)</pre>
 => AlgEv While m v where
  algEv (While (C c) (C lp)) = loop
    where loop = do Just b <- liftM getBool c
                   if b then (lp >> loop)
                         else return unit
instance (Monad m, VBool ::< v) => AlgEv If m v where
  algEv (If (C c) (C x) (C y)) = do
       Just b <- liftM getBool c; if b then x else y</pre>
```

Appendix B:

Virtual Machine Algebras

instance Exec EXCEPT where

```
exAlg (THROW)
                  (k, s)
    = unwind (k, s)
  exAlg (MARK h c) (k, s)
    = c (HAN h : k, s)
  exAlg (UNMARK c) (e : HAN _ : k, s)
    = c (e : k, s)
unwind (HAN h : k, s) = h (k, s)
unwind ( _{-} : k, s) = unwind (k, s)
unwind ([], s) = ([], s)
instance Exec STATE where
  exAlg (GET v c) (k, s)
    = case Map.lookup v s of
        Just n \rightarrow c (VAL n : k, s)
        Nothing -> unwind (k, s)
  exAlg (SET v c) (VAL n : k, s)
    = c (k, Map.insert v n s)
```

instance Exec COMP where

instance Exec HALT where

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