Model-driven Engineering from Modular Monadic Semantics: Implementation Techniques Targeting Hardware and Software*

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Abstract. Recent research has shown how the formal modeling of concurrent systems can benefit from monadic structuring. With this approach, a formal system model is really a program in a domain specific language defined by a monad for shared-state concurrency. Can these models be compiled into efficient implementations? This paper addresses this question and presents an overview of techniques for compiling monadic concurrency models directly into reasonably efficient software and hardware implementations. The implementation techniques described in this article form the basis of a semantics-directed approach to model-driven engineering.

1 Introduction

System software is notoriously difficult to reason about—formally or informally—and this, in turn, greatly complicates the construction of high assurance systems. This difficulty stems from the conceptual "distance" between the abstract models of systems and concrete system implementations. Formal system models are expressed in terms of high-level abstractions while system implementations reflect the low-level details of hardware, machine languages and C. One recent trend in systems engineering—model-driven engineering (MDE) [39]—attempts to overcome this distance by synthesizing implementations directly from system specifications. The MDE methodology is attractive for high assurance applications because the process proceeds from a domain specific modeling language that, when specified with a suitable formal semantics, will support verification.

The starting point for this work is recent research applying modular monadic semantics to the design and verification of trustworthy concurrent systems [15, 14, 12, 13]. There are a number of natural "next" questions concerning the set of design and verification principles developed in the aforementioned publications.

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Can system implementations be generated from monad-based specifications and, if so, how is this best accomplished? Are critical system properties preserved by implementation techniques? Can acceptable performance across many dimensions (including speed, size, power consumption, etc.) be achieved? This paper addresses the first question and leaves the others to future work.

This paper considers an instance of MDE for which the models are based in the modular monadic semantics (MMS) of concurrent languages [12, 34]. Monads have a dual nature, being both algebraic structures with properties and a kind of domain-specific language (DSL) supporting programming. The view of monads as DSLs is just the standard view within the functional programming community expressed in a non-standard way: monads encapsulate a specific flavor of computation and provide language constructs (i.e., monadically-typed operators) in which to build computations.

The contributions of this paper are: (1) An exploration of the design requirements for a monadic DSL for describing small concurrent systems with shared state (e.g., embedded controllers). This language is called *Cheap Threads* after an article of the same name [18]. (2) Implementation techniques for Cheap Threads (CT) programs targeting both a fixed instruction set and hardware circuits. The first technique is a traditional compiler for a non-traditional language. The second technique translates a CT program into VHDL code from which circuitry may be synthesized and loaded into an FPGA. A DSL for specifying state machines called *FSMLang* [3] serves as an intermediate language. (3) A significant case study demonstrating the application of these techniques to the automatic generation of software-defined radios [23] from CT-style specifications.

It is sometimes said of domain specific languages that what is left out of them is more important than what is left in. By restricting its expressiveness, a DSL design can better capture the idioms of its targeted domain. This is just as true in our case where the limitations imposed are intended to aid in the ultimate goal of verifying high assurance properties. Both with respect to its semantics and implementation strategies, what is left out of CT is crucial to the success of this approach. Because the semantics of CT is fundamentally simpler than that of Haskell, its implementation can be made far simpler as well. Although it dispenses with the constructs that complicate Haskell 98's semantics, CT retains the necessary expressiveness—but no more expressiveness than is necessary.

The decision to create a standalone CT language (as opposed to an embedding within a language such as Haskell) was made for the sake of semantic simplicity. Haskell 98 [36], for example, has a surprisingly complicated semantics [17,21,11] due to certain of its features (e.g., the seq operator, expressive pattern-matching, polymorphic recursion and type classes), while its extension, GHC Haskell, has no standard semantics at all. Furthermore, excluding features such as general recursion results in much more predictable time and space behavior. CT possesses a built-in semantics as each CT language construct corresponds to an algebraic operator of a fixed monad.

Syntactically, CT is simply a sublanguage of Haskell, extended with a simple declaration form for specifying monads. Any CT program is also a Haskell pro-

gram that can be executed with standard implementations like GHC or Hugs. CT contains only the small core of Haskell 98 necessary for defining computations within these monads (function and data declarations, etc.). In particular, CT dispenses with first-class functions, curried functions and partial application, recursive data structures, type classes, polymorphism, the IO monad, and much of the complexity of Haskell 98's pattern matching. General recursion is eschewed in favor of an explicit fixed point operator which operates only on tail-recursive functions.

Another reason to define CT as a standalone language is that, as it will be independent of Haskell implementations, the ultimate results of this research can be re-used far more readily in a variety of settings. There is no high assurance run-time system for Haskell, so relying on the GHC run-time, for example, just "kicks the high assurance can down the road." For embedded systems and many varieties of system software (e.g., garbage collectors, network controllers, device drivers, web servers, etc.), the size of the object code produced would have to be small to be practical, thus eliminating all current Haskell implementations. The presence of garbage collection in Haskell run-time systems is completely unacceptable for some software systems because of timing issues (e.g., flight control software). It is fortunate, therefore, that CT does not require the full power of the Haskell RTS with its attendant unpredictable time and space behavior.

When considered individually, software compilation and hardware synthesis represent signal achievements in Computer Science. While there has been some success with mixed target compilation—i.e., the generation of either hardware or software implementations from a single source—the record is mixed.

The challenge derives in trying to compile the same specification into targets—i.e., hardware and software—that encapsulate vastly different notions of computation.



The use of monads in the present work allows us to explicitly tailor the source notion of computation so that it may be implemented efficiently in either hardware or software. The implementation techniques considered here are portrayed in the inset figure. The Cheap Threads language is defined in Section 3. The top route (described in Section 4) shows what is essentially a traditional compiler for a non-traditional language producing RISC MicroBlaze machine language. The lower path (described in Section 5) first generates an intermediate form in FSMLang, which is a DSL specifying for abstract state machines. FSMLang provides a clean target for synthesis at a lower level of abstraction than CT and can be readily translated into a netlist for the Xilinx FPGA. The rest of this section presents related work and Section 2 presents an overview of monadic semantics and defunctionalization. Section 6 presents a case study in the application of Cheap Threads to the specification and implementation of software defined radios. Section 7 presents conclusions and future work.

Related Work. Recent research concerns the construction and verification of formal models of separation kernels using concepts from language semantics [15,

14, 12]. These models may be viewed as a domain-specific language (DSL) for separation kernels and can easily be embedded in the higher-order functional programming language Haskell 98 to support rapid prototyping and testing.

The "by layer" approach to implementing monadic programs—i.e., compiling by monad transformer—was first explored by Filinski [9] who demonstrated how the most commonly used layers (i.e., monad transformers) may be translated into a λ -calculus with first-class continuations; the resulting program could be then further compiled in the manner of Appel [5]. Filinski's approach would work here as it handles all of the monad transformers used in CT. Li and Zdancewic [26] show how a monadic language of threads may be implemented via the GHC compiler; their implementation is efficient with respect to execution speed. Their work is not intended to provide efficiency with respect to code size as is ours. Liang and Hudak [27] embed non-proper morphisms of a source monadic expression in Standard ML, thereby providing a means of implementing monadic programs. We opted for a more standard approach to compilation than these as doing so would give more control over the target code produced and, furthermore, seemed more susceptible to verification.

Recent research applies DSLs to bridge the distance between the abstract models of systems and concrete system implementations. DSLs targeting the design, construction, and/or verification of application-specific schedulers are CATAPULTS [38], BOSSA [24], and Hume [10]. DSLs have also been successfully applied to the construction of sensor networks and network processors [25, 7]. The research reported here has similar goals to this work, although we also seek to address high assurance as well; this motivated our use of monadic semantics as a basis for system modeling and implementation.

Semantics-directed compilation (SDC) [35] is a form of programming language compilation which processes a semantic representation of the source program to synthesize the target program. Because one starts from a formal specification of the input program, semantics-directed compilers are more easily proved correct than traditionally structured compilers, and this is the principal motivation for structuring compilers in this manner. This research uses a classic program transformation called *defunctionalization* as a basis for SDC. Defunctionalization is a powerful program transformation discovered originally in the early 1970s by Reynolds [37] that has found renewed interest in the work of Danvy et al. [8, 1, 2]. Hutton and Wright [20] defunctionalize an interpreter for a small language with exceptions into an abstract machine implementation. Earlier, they described a verified compiler for the same language [19].

Monads have been used as a modular structuring technique for DSLs [41] and language compilers [16]. The research reported here differs from these in that monads are taken as a source language to be implemented rather than as a tool for organizing the implementations of language processors.

Lava [6] is a domain-specific language for describing hardware circuitry, embedded in Haskell. Similarly, HAWK [29] is a Haskell-based DSL for the modeling and verification of microprocessor architectures. Both of these DSLs utilize the embedding within Haskell to allow the modeling of hardware signals as Haskell

lazy lists, providing a simple simulation capability. Moreover, Lava and Hawk allow a programmer to define the *structural* implementation of circuits, using the Haskell host language to capture common structural patterns as recursive combinators. This stands in contrast to the work presented in this paper, where we use a monadic language to describe and compile *behavioral* models of systems, in keeping with our goal of enabling verification of high-level system properties.

SAFL [32, 40] is a functional language designed for efficient compilation to hardware circuits. SAFL provides a first-order language, restricted to allow static allocation of resources, in which programs are described behaviorally and then compiled to Verilog netlists for simulation and synthesis. An extension, called SAFL+, adds mutable references and first-class channels for concurrency. CT provides similar capabilities [23], especially in regards to hardware compilation. However, language extensions facilitating stateful and concurrent effects are constructed using the composition of monad transformers to add these orthogonal notions of computation.

2 Background

We assume of necessity that the reader possesses some familiarity with monads and their uses in functional programming and the denotational semantics of languages with effects. This section includes additional background information about monadic semantics intended to serve as a quick review. Readers requiring more should consult the references for further background [31, 28].

Monads. A monad is a triple $\langle M, \eta, \star \rangle$ consisting of a type constructor M and two operations η (unit) and \star (bind) with the following types: $\eta: a \to M$ a and $(\star): M$ $a \to (a \to M$ $b) \to M$ b. These operations must obey the well-known monad laws [31]. The η operator is the monadic analogue of the identity function, injecting a value into the monad. The \star operator is a form of sequential application. The "null bind" operator, >>: M $a \to M$ $b \to M$ b, is defined as: $x >> k = x \star \lambda_- k$. The binding (i.e., " λ_- ") acts as a dummy variable, ignoring the value produced by x.

Recent research [12, 18] has demonstrated how concurrent behaviors (including process synchronization, asynchronous message passing, preemption, forking, etc.) may be described formally and succinctly using monadic semantics. These kernels are constructed using resumption monads [34]. Resumptions are a denotational model for concurrency discovered by Plotkin that were later formulated as monads by Moggi [31]. Intuitively, a resumption model views a program as a (potentially infinite) sequence of atoms, $[a_0, a_1, \ldots]$, where each a_i may be thought of as an atomic machine instruction. Concurrent execution of multiple programs may then be modeled as an interleaving of each of these program threads (or as the set of all such interleavings).

Monad transformers allow us to easily combine and extend monads. There are various formulations of monad transformers; we follow that given in Liang et al. [28]. Below we give several equivalent definitions for both a "layered" state monad, K, and a resumption monad, R. The first definition of monad K

is in terms of state monad transformers, $StateT\ Reg_i$, and the identity monad, $I\ a=a$. The state types, Reg_i , can be taken, for the sake of this article, to represent integer registers. The resumption monad, R, is defined first with the resumption monad transformer ResT, and then in Haskell. The definitions of the state monad and resumption transformers can be found elsewhere [28, 12].

```
\begin{array}{ll} K & = StateT \; Reg_1 \; (\cdots (StateT \; Reg_n \; I) \cdots) \\ K \; A & \cong Reg_1 \rightarrow \cdots \rightarrow Reg_n \rightarrow (A \times Reg_1 \times \cdots \times Reg_n) \\ R & = ResT \; K \\ \mathbf{data} \; R \; a = Done \; a \; | \; Pause \; (K \; (R \; a)) \end{array}
```

These two monads define the following language:

```
get_i: K Reg_i \quad put_i: Reg_i \rightarrow K () step: K a \rightarrow R a
```

The operation, get_i , reads the current contents of the *i*th register and $(put_i \ v)$ stores v in the *i*th register. The operation, $step \ \varphi$, makes an atomic action out of the K-computation φ . Monadic operations are sometimes referred to as non-proper morphisms.

Resumption based concurrency is best explained by an example. We define a *thread* to be a (possibly infinite) sequence of "atomic operations." Think of an atomic operation as a single machine instruction and a thread as a stream of such instructions characterizing program execution. Consider first that we have two simple threads $a = [a_0; a_1]$ and $b = [b_0]$. According to the "concurrency as interleaving" model, concurrent execution of threads a and b means the set of all their possible interleavings: $\{[a_0; a_1; b_0], [a_0; b_0; a_1], [b_0; a_0; a_1]\}$.

The ResT monad transformer introduces lazy constructors Pause and Done that play the rôle of the lazy cons operator in the stream example above. If the atomic operations of a and b are computations of type K (), then the computations of type R () are the set of possible interleavings:

```
Pause (a_0 \gg \eta(Pause(a_1 \gg \eta(Pause(b_0 \gg \eta(Done()))))))
Pause (a_0 \gg \eta(Pause(b_0 \gg \eta(Pause(a_1 \gg \eta(Done()))))))
Pause (b_0 \gg \eta(Pause(a_0 \gg \eta(Pause(a_1 \gg \eta(Done())))))))
```

In CT, these threads would be constructed without reference to Pause and Done using step: ($step\ a_0 >>_R step\ a_1 >>_R step\ b_0$); this thread is equal to the first one above

Just as streams are built with a lazy "cons" operation (h:t), the resumption-monadic version uses an analogous formulation: $Pause(h >> \eta t)$. The laziness of Pause allows infinite computations to be constructed in R just as the laziness of cons in (h:t) allows infinite streams to be constructed.

A refinement to the concurrency model provided by ResT, called reactive resumptions [12], supports a request-and-response form of concurrent interaction, while retaining the same notion of interleaving concurrency. Reactive concurrency monads also define a signal construct for sending signals between threads. We do not consider the signal construct in this article, although it is used in the case study in Section 6. Its implementation is similar to a procedure call.

```
(* main0 : int -> int *)
fun main0 n
                                                                                     \Rightarrow_{init} \langle n, C_0 \rangle
                                                              n
    = fac0 n
                                                              \langle 0, k \rangle
                                                                                     \Rightarrow_{fac} \langle k, 1 \rangle
(* fac0 : int -> int *)
                                                                                     \Rightarrow_{fac} \langle n-1, C_1(n,k) \rangle
                                                              \langle n, k \rangle
and fac0 0
                                                              \langle C_1(n,k), v \rangle \Rightarrow_{cont} \langle k, n \times v \rangle
        = 1
                                                              \langle C_0, v \rangle
                                                                                      \Rightarrow_{final} v
    | fac0 n
       = n * (fac0 (n - 1))
```

Fig. 1. Defunctionalizing Produces an Abstract State Machine. The factorial function, fac0 (left), is transformed via defunctionalization into the state machine (right). Example originally appears in Danvy [2].

Defunctionalization. Defunctionalization is a program transformation (due originally to Reynolds [37] and rejuvenated of late by Danvy et al. [1,2]) that transforms an arbitrary higher order functional program into an equivalent abstract state machine. Defunctionalization may also be performed on monadic programs as well [2]. This section reviews defunctionalization.

```
(* main1 : int -> int *)
                                       (* main2 : int -> int *) datatype cont
fun main1 n
                                       fun main2 n
                                         = fac2 (n, CO)
                                                                    | C1 of int*cont
 = fac1 (n, fn a => a)
(* fac1 : int*(int->int)->int *)
                                       (* fac2:int*cont->int *)
                                                                 (* appcont : cont*int->int *)
and fac1 (0, k)
                                       and fac2 (0, k)
                                                                  fun appcont (CO, v)
    = k 1
                                         = appcont (k, 1)
  | fac1 (n, k)
                                         | fac2 (n, k)
                                                                    | appcont (C1 (n, k), v)
  = fac1 (n - 1, fn v \Rightarrow k (n * v))
                                         = fac2 (n-1, C1(n,k))
                                                                    = appcont (k, n * v)
```

Fig. 2. Defunctionalization process for the factorial function. The function, fac0 (see Fig. 1, left), is transformed into an equivalent state machine by CPS transformation (left), closure conversion (right), and defunctionalization (see Fig. 1, right).

Defunctionalizing the factorial function (Fig. 1, left) produces an equivalent state machine (Fig. 1, right). In this machine, there are three types of configurations on which the rules act; integers are initial/final configurations, pairs of type int*cont and pairs of type cont*int. The translation first performs the continuation-passing style (CPS) transformation (Fig. 2, left) to expose control flow and then performs closure conversion (Fig. 2, right) to represent the machine states as concrete, first-order data. The function fac2 resulting from closure conversion is then reformatted into the familiar arrow style for rewrite rules (Fig. 1, right).

Defunctionalization for monadic programs proceeds along precisely the same lines as before once the definitions for the monadic operators (i.e., η , \star , and non-proper morphisms) are unfolded [2]. CT programs are simpler to defunc-

tionalize than general higher-order functions. Because the control flow within a CT program is already made manifest by its monadic structure, the CPS transformation is unnecessary. We show below in Section 5 how CT programs may be defunctionalized.

```
monad K = StateT(Int) G
monad R = ResT K
               :: K()
action A
               = get_G \star_{\scriptscriptstyle{K}} \lambda \ g. \ put_G \ (g+1)
action A
action B
               :: K ()
               = get_G \star_K \lambda g. put_G (g-1)
action B
               :: Int \rightarrow Int \rightarrow R ()
chan
chan
               = fix (\lambda \kappa. \lambda a. \lambda b.
                         step\ (put_G\ a \gt\gt_K\ actionA \gt\gt_K\ get_G) \star_R \lambda\ newa.
                         step\ (put_G\ b >>_K\ action B >>_K\ get_G) \star_R \lambda\ newb.
                            \kappa newa newb)
               :: R()
main
               = chan 0 0
main
```

Fig. 3. Example Cheap Threads program

3 Defining the Cheap Threads Language

The CT language is a proper subset of Haskell 98, extended with a special declaration form for specifying monads. It shares a concrete syntax with Haskell—in fact, any CT program may be tested in a standard Haskell environment such as GHC or Hugs, provided that Haskell definitions are supplied for the monads declared in that program. The implementation of tuples and algebraic data types, while straightforward, is not discussed in this paper in order to simplify the presentation. These features are not needed for the case study.

Figure 4 gives a grammar for CT. A program consists of one or more declarations, which may be a type signature, a function declaration, a data declaration, or a monad declaration. All function declarations must be preceded by an explicit type signature. The distinguished symbol main serves as the main entry point to the program and must have type R (). An example program is given in Figure 3. The example defines two atomic state operations actionA and actionB, which respectively increment and decrement the global register G. The function

chan interleaves an infinite sequence of actionA operations with an infinite sequence of actionB. Between atomic operations, chan performs a context switch by saving the value of G in process A, and restoring the value of G in process B (or vice versa). As a result, the processes A and B do not affect each other's execution, even though they both make use of the same global register.

```
program
            ::= decl^*
                                                            ::= (expr)
                                                    expr
decl
            ::=tysig
                                                                 expr expr
                                                                 expr binop expr
                fundecl
                datadecl
                                                                 integer\_literal
                monaddecl
                                                                 boolean\_literal
            ::= ident ident^* = expr
fundecl
datadecl
                                                                 if expr then expr else expr
    data dtype = condecl {| condecl}
                                                                 case expr of
                                                                    \{pat \rightarrow expr\}^*
condecl
            ::= constr basetune
monaddecl := monad K = layer \{+ layer\}
                                                                 (expr\{,expr\}^+)
             \mid monad R = ResT K
lauer
            ::= StateT (basetype) ident
                                                                 expr \star_m
tusia
            ::= ident :: tupe
                                                                 expr \star_m lambda
            ::= Int
basetupe
                                                                 expr >>_m expr
                Bool
                                                                 \eta_m \ expr
                                                                 fix expr
                 ()
                (basetype\{,basetype\}^+)
                                                                 fix lambda
                                                                 get_{ident}
                dtype
type
                (type)
                                                                 put_{ident}\ expr
                                                                 step expr
                base type
                type \rightarrow type
                                                    lambda ::= (lambda)
                m basetype
                                                                 \lambda ident.expr
pat
                                                                 \lambda ident.lambda
                ident
                                                             ::= K \mid R
                 constr\ ident^*
                (ident{,ident}^+)
```

Fig. 4. Grammar for the Cheap Threads language.

While CT's concrete syntax is borrowed from Haskell, it is fundamentally a much simpler language. We note a few important distinctions at the outset. **Declaration Form for Monads.** A special *monad* declaration form is used to construct state and resumption monads. The types and morphisms associated with these declarations are built in to the language—they are not represented in terms of the source language. We require that a program define exactly one state monad named K, and one resumption monad named R defined in terms of K. Recursion Tightly Controlled, No Mutual Recursion. Recursive functions may be defined only by explicit use of the fixed point operator f(x), which only accepts tail-recursive functions. Any function not defined in terms of fix is total. Recursion without fix is not possible, because the body of a function may not refer to that function's name, nor to any named function that does not precede it in the source text. Algebraic data types also are not allowed to be recursive. Simplified Type System. The type system dispenses entirely with polymorphism and type classes. No Higher-Order Functions. The only place where the type system allows a higher-order function to be used is as the operand to fix. Lambda expressions are only allowed to occur on the right-hand

side of a monadic "bind" operator, or as the operand of fix. **Simplified Pattern Matching.** Pattern matching is limited to deconstructing algebraic data types and tuples, and may occur only in the context of a case expression. Patterns may not be nested.

Monad Declarations. CT provides built-in support for constructing monads from the standard state monad transformer StateT [28], as well as the resumption monad transformer ResT [34, 12] for concurrency. Monads are specified by a special declaration form, similar to (but less general than) that provided by MonadLab [22]. The example in Figure 5 (top) defines two monads K and R. Monad K is built from three applications of the state monad transformer, reflecting a notion of state comprised of two Int-typed registers and one Bool-typed flag. Note that StateT components must have unique names. Monad R applies the resumption transformer to K, enabling us to express interleavings of K-computations.

```
 \begin{array}{lll} \mathbf{monad} \ K = StateT(Int) \ Reg1 \ + \ StateT(Int) \ Reg2 \ + \ StateT(Bool) \ Flag \\ \mathbf{monad} \ R = ResT \ K \end{array}
```

```
get_{Reg1}: K \ Int \qquad get_{Reg2}: K \ Int \qquad get_{Flag}: K \ Bool \ put_{Reg1}: Int \rightarrow K \ () \qquad put_{Reg2}: Int \rightarrow K \ () \qquad put_{Flag}: Bool \rightarrow K \ () step: K \ a \rightarrow R \ a
```

Fig. 5. Example monad declarations in Cheap Threads (top). Non-proper morphisms produced by the declarations (bottom). N.b., step can be typed at any base type a; CT is not polymorphic.

These declarations produce "bind" and "unit" operations for the K and R monads, along with the non-proper morphisms for state and resumptions given in Figure 5 (bottom). It is important to note that these operations are primitive within the CT language; unlike their Haskell counterparts, they are not implemented in terms of newtypes, higher-order functions, etc., but instead are handled directly by the compiler.

Restricting Recursion. An important design consideration of CT is that it should be implemented in a straightforward manner with loop code. To that end, one important distinction between CT and Haskell is that recursion in CT is strictly limited to tail recursive functions whose codomain is in the resumption monad. Recursive declarations must include explicit applications of the fixed

point operator fix. This operator takes a function whose type is of the form:

$$(\tau_1 \rightarrow \tau_2 \rightarrow \cdots \rightarrow \tau_n \rightarrow R t) \rightarrow (\tau_1 \rightarrow \tau_2 \rightarrow \cdots \rightarrow \tau_n \rightarrow R t)$$

where $\tau_1, \tau_2, \dots, \tau_n, t$ are base types (i.e. non-functional and non-monadic), and iterates it. A static check, separate from the type system, enforces the requirement that the iterated function be tail recursive. Algebraic data types also are not allowed to be recursive.

Type System. CT is a simply-typed language with primitive types *Int*, *Bool*, and (); tuples and non-recursive algebraic data types; function types; and monadic types. Support for higher-order functions is limited. A simply-typed system was chosen over a polymorphic one because it makes it easier to restrict type expressiveness. Because the typing rules are mostly standard, we will discuss only the unusual cases.

Due to the fact that functions are not true first-class values, partial application is not allowed, and the use of higher-order functions is limited to the built-in fix operator. These restrictions are expressed by the rule for application:

$$\frac{\Gamma \vdash e_1, e_2, \cdots, e_n : \tau_1, \tau_2, \cdots, \tau_n}{\Gamma \vdash f : \tau_1 \to \tau_2 \to \cdots \to \tau_n \to t} \frac{\Gamma \vdash f : \tau_1 \to \tau_2 \to \cdots \to \tau_n \to t}{\Gamma \vdash f e_1 e_2 \cdots e_n : t} (\tau_1, \cdots, \tau_n, t \text{ do not contain } \to)$$

Note that while this rule does not stop the programmer from *defining* higher-order functions, it does preclude the *application* of higher-order functions. We make this distinction rather than excise higher-order functions altogether because *fix* actually does operate on higher-order functions of a certain form.

The monadic "bind" and "unit" operators for each supported monad are built in to the language. Rather than supply a single set of operators overloaded over all monads, the operators are subscripted to make explicit the monad in which they operate. In each of the following rules, m may stand for a monad (K or R in Figure 5 (top)), and τ , τ' must be base types.

$$\frac{\Gamma \vdash \varphi : m \, \tau \quad \Gamma \vdash f : \tau \to m \, \tau'}{\Gamma \vdash \varphi \star_m f : m \, \tau'} \quad \frac{\Gamma \vdash \varphi : m \, \tau \quad \Gamma \vdash \varphi' : m \, \tau'}{\Gamma \vdash \varphi >>_m \varphi' : m \, \tau'}$$

$$\frac{\Gamma \vdash e : \tau}{\Gamma \vdash \eta_m \, e : m \, \tau}$$

State and resumption monad operations are also built in, and have analogous types to their Haskell counterparts [28, 34]. If the state monad K has a component $StateT(\tau)$ Elem, it is assumed that the tags (e.g., Elem) are unique. The state operations get_{Elem} and put_{Elem} are typed as follows:

$$\frac{\Gamma \vdash e : \tau}{\Gamma \vdash get_{Elem} : K \ \tau} \ \frac{\Gamma \vdash e : \tau}{\Gamma \vdash put_{Elem} \ e : K \ ()}$$

The step and fix morphisms of the R monad are typed as follows:

$$\frac{\Gamma \vdash \varphi : K \tau}{\Gamma \vdash step \, \varphi : R \tau} \quad \frac{\Gamma \vdash f : (\tau_1 \to \cdots \to \tau_n \to R \, t) \to (\tau_1 \to \cdots \to \tau_n \to R \, t)}{\Gamma \vdash fix \, f \, : \, \tau_1 \to \cdots \to \tau_n \to R \, t}$$

where $\tau_1, \tau_2, \cdots, \tau_n, t$ are base types.

4 Compiling Cheap Threads

In this section we discuss the compilation of CT to intermediate code. The compiler targets the intermediate language described in Table 1, which we will refer to as the RTL. The RTL is a simple register transfer language. Two types of registers exist: general-purpose virtual registers (rn), and "named" registers (rs) where s is a string beginning with a non-numeric character) which are used to hold global state (i.e. state components of K).

| Instruction | Meaning |
|-----------------|--------------------------------------------------------------------------|
| l: | Label. |
| r := n | Stores the constant value n in register r . |
| r1 := r2 | Copies the value in register $r2$ into register $r1$. |
| r1 := r2 + r3 | Adds the value stored in $r2$ to the value stored in $r3$ and stores the |
| | result in $r1$. |
| r1 := r2 - r3 | Subtracts the value stored in $r3$ from the value stored in $r2$ and |
| | stores the result in $r1$. |
| BZero r l | Jumps to label l if the value stored in r is zero. |
| ${\tt Jump}\ l$ | Jumps to label l . |

Table 1. The intermediate language targeted by the compiler.

It is a simple matter to generate instructions for a RISC-like architecture from our intermediate language. We have implemented an instruction selection phase for MicroBlaze, a 32-bit RISC soft processor designed to be run on FPGA fabric. Instruction selection is entirely straightforward, so we omit the details.

4.1 Translation from Cheap Threads

This section describes the compilation of CT to the RTL. The compiler is implemented in Haskell, using the parser from the haskell-src library. Compilation proceeds in three passes: type checking (see Section 3), inlining, and code generation.

Inlining. In the inlining pass, all calls to non-recursive functions are inlined, starting with *main* at the root of the call tree. The output from the inliner is essentially one "giant term" in which the only function applications that occur

are those of recursive functions, and the only variable references that occur are to λ -bound variables, which may appear only in a function passed to fix or on the right-hand side of \star_m .

Code Generation. After inlining, we generate code for the resulting term in a syntax-directed fashion. The code generation function codegen returns a sequence of RTL commands implementing the source expression, and the register in which those commands store the result, if any. Let CtExpr be the data type corresponding to expr in Figure 4, and RtlCom be the data type representing RTL commands. Then the type of codegen is $CtExpr \rightarrow CM$ ([RtlCom], Register), where CM is a monad providing mechanisms for generating fresh registers and labels, and binding variables to registers.

Notational Convention. For the sake of brevity, we will describe the translation rules according to the convention that $\lceil e \rceil$ is the code generated by translating the expression e, and anywhere after an occurrence of $\lceil e \rceil$, we may refer to the register in which e's result is stored as r_e . That is, $\lceil e \rceil$ is the list of RtlComs returned by $codegen\ e$, and r_e is the Register returned by $codegen\ e$. We use Haskell-style comments (beginning with a long dash — and extending to the end of a source line), and a comment at the end of the translation rule indicates which register is the result register.

Compiling Pure Expressions. We first consider the compilation of pure, that is non-monadic, expressions. If the expression to be compiled is of type *Int*, *Bool*, or (), the result is simply stored in a freshly-generated register. For example, we compile addition as follows:

Values of type () have no result register.

Compiling Monadic Expressions. The \star_m and $>>_m$ operators are compiled much like function composition. Assume without loss of generality that terms on the right-hand side of \star_m are always λ -expressions. Then:

where $\lceil \chi[x \mapsto r_{\varphi}] \rceil$ denotes that χ is compiled in the current environment, extended by binding variable x to register r_{φ} .

The "unit" operator η_m serves to inject pure computations into a monad. The resumption monad operator *step* serves a similar function, lifting K computations into R. For *step* we generate a label to delineate "*step*-ed" state operations; for the purposes of this paper, these labels are purely informational.

```
 \lceil \eta_{\scriptscriptstyle m} \, e^{\, \gamma} \ = \lceil e^{\, \gamma} \ - \text{Result register is } r_e.   \lceil step \, \varphi^{\, \gamma} = l : \lceil \varphi^{\, \gamma} \ - \text{Where label } l \text{ is fresh. Result register is } r_\varphi.
```

Finally, the state monad morphisms get_{Elem} and put_{Elem} simply read or modify the associated register rElem.

```
 \lceil get_{Elem} \rceil = r := \texttt{r} Elem \qquad \qquad \text{Where $r$ is fresh. Result register is $r$.}   \lceil put_{Elem} \ e^{\gamma} = \lceil e^{\gamma}; \ \texttt{r} Elem := r_e \qquad \text{No result register.}
```

Compiling fix. As we mentioned previously, functions produced by the fix operator must be tail recursive. This means that we can compile applications of fix to simple loop code. Let f be any function satisfying this condition, with parameters named $\kappa, v_1, v_2, \dots, v_n$. Call the body of this function b.

Expression b is compiled in an environment where v_1, v_2, \dots, v_n are bound to registers $r_{e_1}, r_{e_2}, \dots, r_{e_n}$, and in which application of κ is compiled by the following special rule:

Note that the translation schema given above is slightly simplified in that it produces a separate loop for each (outermost) application of a recursive function, resulting in code duplication. This duplication can easily be avoided by memoizing the label at which $\lceil b \rceil$ is stored.

Example. Figure 6 gives the code generated for the example program in Figure 3. Each monadic operation compiles to only a handful of RTL instructions. The resulting code contains only 17 instructions, which one may reasonably expect, at an extremely conservative estimate, to translate to at most a few hundred machine language instructions on any given architecture.

By comparison, ghc-6.10.1 compiling the same code produces a 650-kilobyte binary when targeting x86 on Windows with optimization enabled (disabling optimization produces a slightly larger binary). We believe that most of this code (432 kilobytes) is accounted for by the Haskell runtime system, and much of the remainder is code for various prelude and library functions. Of course, we do not claim that this comparison provides evidence that the CT compiler is "better" than GHC—obviously, GHC compiles a far more expressive source language, and therefore an increase in code size is inevitable. But the comparison does highlight a major advantage of a directly-compiled DSL over one embedded in Haskell: the code produced by Cheap Threads is several orders of magnitude smaller, making it more suitable for use in embedded systems.

```
-- Init G-save for A and B
                                         12:
                                                 Restore G for process B
     r1 := 0
    r2 := 0
                                              rG := r2
                                                 Execute actionB
mainloop:
                                              r7 := rG
11:
      - Restore G for process A
                                              r8 := 1
     rG := r1
                                              r9 := r7
     -- Execute actionA
                                              rG := r9
     r3 := rG
                                              r10 := rG
     r4 := 1
                                               -- Save G vals for next iteration
     r5 := r3
                r4
                                              r1 := r6
                                              r2 := r10
     rG := r5
                                              -- Loop
     r6 := rG
                                              Jump mainloop
```

Fig. 6. RTL code for the program in Figure 3

5 Synthesizing Circuits from Cheap Threads Programs

Producing a circuit from a Cheap Threads program proceeds in two steps. First, the source program is defunctionalized, producing an abstract state machine that is readily formatted in the syntax of the FSMLang DSL. The FSMLang compiler is used to produce VHDL code from which a hardware implementation on an FPGA may be synthesized. Section 5.1 defines the defunctionalization transformation for CT. Section 5.2 describes the design and syntax of FSMLang.

5.1 Defunctionalizing Cheap Threads.

This section formulates the defunctionalization transformation for CT. The resulting state machine, $\langle States, Rules \rangle$, consists of a set of states, States, and a set of transformation rules, Rules, of type $States \rightarrow States$. Defunctionalization takes place "by layer" in that terms typed in K are defunctionalized separately from those typed in R.

Defunctionalizing Layered State Monads. The states and rules of the target machine arise directly from the definitions of K and the source term being transformed, respectively. Let us assume that K is a state monad of the form, $K = StateT Reg_1 (\cdots (StateT Reg_n I) \cdots)$. The elements of States are tuples determined by (1) the λ -bound variables within the program, (2) the states Reg_i within monad K, and an additional component for the value returned by the computation. Variables bound by λ are assumed without loss of generality to be unique and any fix bound variables (e.g., the " κ " in " $fix(\lambda\kappa.\cdots)$ ") are not considered λ -bound. For the language defined in Section 3, the type of return values will always be one of Int, Bool, or (); let type Val = Int + Bool + ().

Taking this into consideration, the elements of States of the target machine have type $Reg_1 \times \cdots \times Reg_n \times Var_1 \times \cdots \times Var_m \times Val$. For each λ -bound variable or state in K, there is a corresponding component within the States type. Define c as the total number of components as: c = m + n. We define the update and

read transitions, upd_x and $read_{x_i}$, as:

$$\begin{array}{l} (x_1,\cdots,x,\cdots,x_c,v) \mapsto_{upd_x} (x_1,\cdots,v,\cdots,x_c,v) \\ (x_1,\ldots,x_i,\ldots,x_c,v) \mapsto_{read_{x_i}} (x_1,\ldots,x_i,\ldots,x_c,x_i) \end{array}$$

The upd_x transition sets the x "slot" to the value component while the $read_{x_i}$ transition sets the value component to the current contents of x_i .

Each K term gives rise to one rule only and is derived in a syntax-directed manner. The get, put and unit operations are straightforward. Below, assume that $1 \le i \le n$ (i.e., put_i and get_i are defined only on components corresponding to K states) and let $s = (x_1, \ldots, x_c, v)$ be the input state in:

$$K\lceil put_i \ e \rceil = s \mapsto (x_1, \dots, eval \ e \ s, \dots, x_c, ())$$

 $K\lceil get_i \rceil = read_{x_i}$
 $K\lceil \eta_K \ e \rceil = s \mapsto (x_1, \dots, x_c, eval \ e \ s)$

The unit computation, η_{κ} e, is defunctionalized to a transition that only updates the return value state component to the value of e in the input state s, $eval\ e\ s$. The definition of eval is not given as it is an unremarkable expression interpreter. Note that, by construction, expression e will be of base type and will only refer to the components corresponding to λ -bound variables.

The bind operations for K, \star_K and $>>_K$, are defined in terms of function composition. The transitions are total endofunctions on system configurations and, therefore, possess the standard notion of function composition.

$$\begin{array}{ll} K\lceil\varphi >>_{\scriptscriptstyle{K}} \gamma\rceil &= K\lceil\gamma\rceil \mathrel{\circ} K\lceil\varphi\rceil \\ K\lceil\varphi \star_{\scriptscriptstyle{K}} \lambda x.\gamma\rceil &= K\lceil\gamma\rceil \mathrel{\circ} upd_x \mathrel{\circ} K\lceil\varphi\rceil \end{array}$$

Defunctionalizing R. This section first describes the defunctionalization of the resumption layer at a high level. Then equations formulating R[-] are given next. Finally, the results of defunctionalizing the running example are then presented. Defunctionalizing an R computation produces a state machine whose state type includes one more component than does K's:

$$PC \times Req_1 \times \cdots \times Req_n \times Var_1 \times \cdots \times Var_m \times Val$$
 where $PC = Int$

This additional component may be thought of as a "program counter" represented as an *Int*. The resulting state machine also includes multiple transitions.

High-level overview. Whereas layered state adds functionality to CT languages in the form of put and get operations, the resumption layer adds control mechanisms in the form of step and fix. Roughly speaking, an R-computation is a sequence of K-computations chained together by \star_R or $\gt\gt_R$; using only $\gt\gt_R$ for presentation purposes, an R-computation looks like:

$$(step \ \varphi_1) >>_R \cdots >>_R (step \ \varphi_j)$$

Defunctionalizing each $(step \varphi_i)$ is performed by applying $K \lceil - \rceil$ to each φ_i and thereby producing a single corresponding rule, $l_i \mapsto r_i$. Defunctionalizing $\gt\gt_R$ in the above makes the control flow explicit by attaching a "program counter" (starting without loss of generality from 1) to states; this produces the set of rules:

$$\{(1, l_1) \mapsto (2, r_1), \dots, (j-1, l_{j-1}) \mapsto (j, r_{j-1})\}$$

Consider now a fixed computation, $fix(\lambda\kappa.\lambda\bar{x}.\gamma)$. As it is tail recursive, occurrences of a recursive call, $\kappa \bar{e} : R \ Val$, will be accomplished by a rule that (1) updates the state variables corresponding to λ -bound variables \bar{x} to the arguments \bar{e} and (2) changing the program counter component to point to the "beginning" of γ .

Detailed formulation. We present the equations defining R[-] in a Haskell-like notation, suppressing certain representation details for the sake of clarity. These equations are written in terms of a layered monad, M, containing an integer state for generating labels and an environment mapping recursively bound variables to their formal parameters. The specification of monad M is given in the MonadLab DSL [22], which allows monads to be specified simply in terms of monad transformers and hides certain technical details (e.g., order of application and lifting of operations through transformers):

```
\begin{array}{lll} \mathbf{monad} \ M &= EnvT(Bindings) \ Env \ + \ StateT(Int) \\ \mathbf{type} \ Bindings &= Var \ \rightarrow \ [Var] \\ \mathbf{type} \ Var &= String \end{array}
```

MonadLab generates Haskell code defining the first four functions below; the last operator is defined as: $counter = get >>= \lambda i. put (i + 1) >> \mathbf{return} i.$

The defunctionalization, $R\lceil e \rceil$, is a computation of the transitions corresponding to e. Defunctionalizing a stepped K-computation first defunctionalizes its argument (φ) , producing a transition, $l \mapsto r$. This K-transition is converted into an R-transition by adjoining program counter components to both sides; $(i, (x_1, \ldots, x_c, v))$ is identified with (i, x_1, \ldots, x_c, v) . The unit computation, $(\eta_R e)$, is translated analogously to step:

```
\begin{array}{ll} R\lceil -\rceil & :: \ CTExpr \ \rightarrow \ M \ [Rule] \\ R\lceil step \ \varphi \rceil = counter >>= \lambda i. \ \mathbf{return} \ [(i,l) \mapsto (i+1,r)] \\ & \mathbf{where} \ (l \mapsto r) = K\lceil \varphi \rceil \\ R\lceil \eta_{\scriptscriptstyle R} \ e \rceil & = counter >>= \lambda i. \ \mathbf{return} \ [(i,l) \mapsto (i+1,r)] \\ & \mathbf{where} \ (l \mapsto r) = K\lceil \eta_{\scriptscriptstyle K} \ e \rceil \end{array}
```

To defunctionalize a recursive expression, one first gets the next fresh label (i) and reads the current bindings (β) . In an expanded environment (β') that binds the recursive variable (κ) to its formal parameters (v_1, \ldots, v_m) , the body (e) is defunctionalized to a list of rules (ρ) . Assuming there is a unique label associated with κ , called L_{κ} , the transition list ρ is augmented with a transition, $mkstart \kappa i$, that serves as the "beginning of the loop"; the augmented list is returned:

```
R\lceil fix(\lambda\kappa.\lambda v_1.\cdots\lambda v_l.e)\rceil = get >>= \lambda i.
rdEnv >>= \lambda \beta.
(inEnv \beta' R\lceil e\rceil) >>= \lambda \rho.
\mathbf{return} \ (mkstart \ \kappa \ i \ : \ \rho)
\mathbf{where}
\beta' \qquad = \beta\{\kappa := [v_1, \dots, v_l]\}
mkstart \ \kappa \ i = (L_{\kappa}, x_1, \cdots, x_c, v) \mapsto (i, x_1, \cdots, x_c, v)
```

A recursive call is translated to a transition that takes an input state and moves to a state with label L_{κ} (defined above) and, in effect, this transition jumps to the head of the "loop". For the sake of simplifying the presentation, the definition below only gives the case where κ has one argument (i.e., κ has type $\tau \to R\tau'$); the full definition is analogous. This recursive call occurs within the body of an expression of form, fix ($\lambda \kappa. \lambda x. body$). In the following, assume that x is the inner λ -bound variable represented in the state configuration:

```
R\lceil \kappa e \rceil = counter >>= \lambda i.

return [(i, x_1, \dots, x, \dots, x_c, v) \mapsto (L_{\kappa}, x_1, \dots, eval\ e\ s, \dots, x_c, v)]

where s = (x_1, \dots, x, \dots, x_c, v)
```

This presentation is simplified also in that the details of looking up x in the bindings for κ are suppressed. Defining R[-] for the bind operations:

```
\begin{array}{ll} R\lceil\gamma>>_{\scriptscriptstyle R}\chi\rceil &=R\lceil\gamma\rceil>>=\lambda\rho_1.R\lceil\chi\rceil>>=\lambda\rho_2.\ \mathbf{return}\ (\rho_1++\rho_2)\\ R\lceil\gamma\star_{\scriptscriptstyle R}\lambda v.\chi\rceil &=R\lceil\gamma\rceil>>=\lambda[\rho_1].\ R\lceil\chi\rceil>>=\lambda\rho_2.\ \mathbf{return}\ (f\ v\ \rho_1\ :\ \rho_2)\\ \mathbf{where}\\ f\ ::\ Var\to Rule\to Rule\\ f\ v\ ((i,s)\mapsto (i',s'))=((i,s)\mapsto (i',upd\ v\ s')) \end{array}
```

Example. Returning to the running example presented in Fig. 3; the relevant portion of the channel code is:

```
chan :: Reg_1 \rightarrow Reg_2 \rightarrow R ()

chan = fix (\lambda k. \lambda a. \lambda b.

step (put_G a >>_K action A >>_K get_G) \star_R \lambda new a.

step (put_G b >>_K action B >>_K get_G) \star_R \lambda new b.

k new a new b)
```

Multiple declarations can be easily accommodated, but rather than elaborate

on such details, assume that the two actions stand for particular transitions:

```
(a, b, newa, newb, reg, val) \mapsto (a, b, newa, newb, reg+1, ()) — actionA
(a, b, newa, newb, reg, val) \mapsto (a, b, newa, newb, reg-1, ()) — actionB
```

The transitions of the state machine produced by defunctionalization are then:

```
initial_state = k
  (k,a,b,newa,newb,r,v) -> (1,a,b,newa,newb,r,v)
  (1,a,b,newa,newb,r,v) -> (2,a,b,a+1,newb,a+1,a+1)
  (2,a,b,newa,newb,r,v) -> (3,a,b,newa,b-1,b-1,b-1)
  (3,a,b,newa,newb,r,v) -> (k,newa,newb,newa,newb,r,v)
```

These transitions may be easily reformatted in FSMLang syntax:

```
initial_state = state_k
                                state_2 -> state_3 where
                                { newb' <= b-1;
state_k -> state_1 where
                                   r,
                                          <= b-1;
{ }
                                          <= b-1; }
state_1 -> state_2 where
                                state_3 -> state_k where
                                { a' <= newa;
{ newa' <= a+1;
                                   b' <= newb; }
   r,
         <= a+1;
         <= a+1; }
```

This constitutes the TRANS section of an FSMLang implementation. The full version includes headers defining a number of initial conditions (e.g., values and sizes of registers, etc.). FSMLang syntax is defined below.

5.2 Overview of FSMLang

FSMLang is a domain-specific language (DSL) for describing finite-state machines (FSMs) [3]. FSMLang targets the configurable logic, embedded memories, and soft-core processors that can be found in modern platform Xilinx FPGAs. FSMLang eliminates the need for a programmer to manually control sensitivity lists, state enumerations, FSM reset behavior, and FSM default output behavior. FSMLang descriptions are much smaller, and less cluttered, than equivalent code written in an HDL. Additionally, the FSMLang compiler is re-targetable – while we focus here on producing hardware, it is also capable of producing FSM implementations in software.

The structure and syntax of an FSMLang program is shown in Figure 7. The TRANS section defines the transitions of the state machine. The defunctionalized Cheap Threads program is formatted directly into FSMLang and insert into the TRANS section of a template with the other sections defined.

```
- Definitions of FIFO channels
  Internal state signal names
                                                CHANNELS:
CS: <current state signal name>:
                                                  (<channelName>. <dataWidth>:)*
NS: <next_state_signal_name>;
 - Compile-time variables
                                                  Internal FSM signals
GENERICS:
                                                  (<sigName>, <type>;)*
  (<genName>, <type>, <static_value>;)*
 -- Definitions of input/output ports
                                                -- Definition of logic/transitions
PORTS:
                                                INITIAL:
  (<portName>, <in|out>, <type>;)*
                                                  <stateName>:
CONNECTIONS:
                                                TRANS:
  (<outputPortName>
                       <= <rhs>:)*
                                                <curr_st> [|<bool_guard>] -> <next_st>
-- Definitions of memories
                                                    [where { (<lhs> <= <rhs>;)* } ]
MEMS:
 (<mName>
 <dataWidth>, <addrWidth> [,EXTERNAL];)*
                                                -- Native VHDL Definitions
                                               VHDL: <un-parsed VHDL code>
```

Fig. 7. FSMLang Program Structure and Syntax.

6 Application: Huffman Encoding

Cheap Threads serves as a basis for generating efficient software and hardware implementations from a monadic model. The ability to generate both hardware and software components of a complete system is of major benefit when constructing embedded systems because it allows performance-critical elements to be compiled into hardware, capitalizing on the implicit parallelism that that fabric provides, while at the same time allowing less performance-critical components to standard microprocessors.

The Computer Systems Design Laboratory at the University of Kansas has used monad compilation for the implementation of software-defined radios. In contrast to a traditional radio, which generally consists of a series of analog and digital hardware components to implement a specific type of radio (called a waveform in the nomenclature of the domain), a software-defined radio (SDR) uses the flexibility of the (traditionally software) platform to allow the radio to be reconfigured to support a variety of different waveforms, as application requirements demand [30].

A typical software defined radio will include a variety of components performing digital signal processing such as modulation, spreading, error correction, compression, and encryption. As an example component, Figure 8 shows the definition of a simple Huffman decoder component. Huffman compression is a simple form of data compression which encodes fixed-sized data into stream of variable-sized symbols, and decoding performs the inverse operation. For example, in the decoder definition, the component converts a stream of bits into a stream of integers. The number of bits needed to represent an integer on the input stream varies depending on the frequency that a particular integer occurs in the original (uncompressed) text. This allows integers that occur relatively frequently to be encoded with fewer bits, which in turn reduces the number of bits that must be transmitted.

```
\begin{array}{l} \mathbf{data} \ Node \ = Emit \ Int \ | \ Branch \ Int \ Int \\ \mathbf{data} \ BMsg \ = BRead \ | \ BWrite \ Bit \ | \ BVal \ Bit \\ \mathbf{data} \ IMsg \ = IRead \ | \ IWrite \ Int \ | \ IVal \ Int \\ \mathbf{data} \ Bit \ = Low \ | \ High \\ \\ decoder \ pos \ tree \ input \ output \ = \\ get \ tree \ pos \ \star_R \ \lambda val. \\ \mathbf{case} \ val \ \mathbf{of} \\ Emit \ v \ \longrightarrow \ signal \ output \ (IWrite \ v) >>_R \ decoder \ 0 \ tree \ input \ output \\ Branch \ l \ r \ \longrightarrow \ signal \ input \ BRead \ \star_R \ \lambda i. \\ \mathbf{case} \ i \ \mathbf{of} \\ BVal \ bit \ \longrightarrow \ \mathbf{case} \ bit \ \mathbf{of} \\ Low \ \longrightarrow \ decoder \ l \ tree \ input \ output \\ High \ \longrightarrow \ decoder \ r \ tree \ input \ output \end{array}
```

Fig. 8. Huffman Decoder. In this example, the fix is implicit and the R monad includes another operator, signal. See the text for further description.

The decoder uses a tree to represent the encoding of integers. The path from the root of the tree to a leaf identifies the encoding of the integer stored at that leaf. Cheap Threads does not allow recursive data types, so a tree is represented using a state monad, where each value in the state is a *Node*. A *Node* can either be *Emit*, which indicates an integer value, or *Branch*, which indicates an additional bit is needed to encode the values in the sub-trees. The two fields for the *Branch* constructor represent the addresses of the left and right child nodes in the state. To generate the encoding for a node, follow the path from the root of the tree (at address 0). At each *Branch*, if the path enters the left child, then generate a 0 (*Low*) bit, and if the path enters the right child, generate a 1 (*High*) bit.

For example, consider the Huffman tree representing the encoding for arbitrary integers a, b, and c. Given an encoding with a as "0", b as "10", and c as "11", the associated tree written using a recursive tree structure is $Branch\ (Emit\ a)\ (Branch\ (Emit\ b)\ (Emit\ c))$. The non-recursive store representation for this tree using the Node structure, mapping integer addresses to Node values, is $0 \mapsto Node\ 1\ 2$, $1 \mapsto Emit\ a$, $2 \mapsto Node\ 3\ 4$, $3 \mapsto Emit\ b$, $4 \mapsto Emit\ c$.

The decoder component in Figure 8 takes advantage of an additional monadic construct, called *signal*, which allows isolated concurrent computations to communicate using a message passing scheme. The semantics of *signal* have been described in detail elsewhere [12], as has the compilation of the construct to VHDL and C [23]. In simple terms, *signal* takes request and passes it to an external entity which interprets the request and generates a response. The computation that generates the request is blocked until a response is generated. As such, the construct models an alternative form of concurrency based on message passing, rather than shared state.

In the implementation of the Huffman decoder, the *signal* construct is used to model the consumption of values from an input stream, one at a time, and to generate values on an output stream. This behavior replaces the common use

of lazy lists in languages such as Haskell to model infinite streams, defining the stream transformation notion of computation in the monadic model rather than in the host language.

The decoder function receives the encoded stream one bit at a time. The pos argument to the function is used to track the current position of the decoder as an address in the state, identified by the tree parameter. If that address contains an Emit value, then the decoder sends that value, using the signal construct, on the output stream. Alternatively, if the current position contains a Branch node, then the decoder will read a value from the input stream, again using the signal construct. The decoder then makes a tail call, using the value of the input bit to determine the value of the pos parameter.

Having defined the Huffman decoder, the component can be compiled to either a hardware or a software implementation and then integrated into the overall desired radio waveform. Moreover, the monadic representation of the component provides a sound basis for constructing an assurance argument for the correctness of the component, a key capability in the software defined radio domain. Compiling the monadic model directly to an executable implementation eliminates the gap between the model used for verification and the resulting implementation.

7 Conclusions

This article presents a foundation for the model-driven engineering of concurrent systems based in semantics-directed compilation. The main vehicle for this approach is the Cheap Threads domain-specific language which encapsulates shared-state concurrency with direct support for state and resumption monads. Cheap Threads may be compiled in a straightforward manner to either a fixed instruction set or to hardware. The defunctionalization program transformation, furthermore, seems to be well-suited to the generation of hardware implementations of Cheap Threads programs.

Defunctionalization is a well-known technique that remained little used until recently. According to Danvy and Nielsen [8], "compared to closure conversion and to combinator conversion, defunctionalization has been used very little." We believe that hardware synthesis from a declarative language is an attractive and practical use-case for defunctionalization. The growing prevalence of FPGA and reconfigurable computing technologies means that expressive source languages for mixed hardware/software systems will only become more important, and this article provides evidence that the state machines produced by defunctionalization are a natural fit for hardware synthesis.

A substantial case study of the compilation of monadic programs to hardware and software has been presented as well, in the form of a Huffman decoder for a software-defined radio. Other substantial examples may be found in Kimmell [23]. These case studies indicate that the approach to MDE described here seems to "scale up" and other applications (esp., monadic separation kernels) are currently under development. Monadic modeling provides a formal basis for verifying high assurance properties of the targeted artifacts. It is expected that the semantics-directed basis will yield benefits in this regard, although formal verification has been left for future work.

Future Work. Hardware/software co-design presents system designers with a continuum: at one end, a system may be implemented entirely in software, and at the other end, it may be implemented entirely in hardware. The present work has explored the extrema of this continuum. An important question for future research is: can we compile some parts of a Cheap Threads program to hardware, and other parts to software, in an efficient manner? One challenge here is in devising an efficient interface for communication between hardware and software logic. Previous work on the Hybridthreads project [4] at the University of Kansas and the University of Arkansas has explored this problem, using C and the POSIX threads API for mixed-target synthesis.

A particularly interesting follow-on revisits a classic paper by Wand [42] which describes a method for deriving abstract machine instruction sets from source language semantics. Modern FPGA technology may enable us to apply similar techniques to synthesize soft processors that directly implement such a derived instruction set. The defunctionalization-based techniques may well shed new light on this classic research.

The High Assurance Security Kernel (HASK) Lab at the University of Missouri is exploring the use of the techniques described here to implement formally verifiable monadic security kernels [15, 14] in hardware and software. The Cheap Threads language, when extended with support for system calls, protected memory, and asynchronous exceptions [33, 13], will provide a separation kernel modeling language with a clear semantics that supports formal verification.

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