

Shifting the Stage

Staging with Delimited Control

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Abstract

It is often hard to write programs that are efficient yet reusable. For example, an efficient implementation of Gaussian elimination should be specialized to the structure and known static properties of the input matrix. The most profitable optimizations, such as choosing the best pivoting or memoization, cannot be expected of even an advanced compiler because they are specific to the domain, but expressing these optimizations directly makes for ungainly source code. Instead, a promising and popular way to reconcile efficiency with reusability is for a domain expert to write code generators.

Two pillars of this approach are types and effects. Typed multilevel languages such as MetaOCaml ensure *safety*: a well-typed code generator neither goes wrong nor generates code that goes wrong. Side effects such as state and control ease *correctness*: an effectful generator can resemble the textbook presentation of an algorithm, as is familiar to domain experts, yet insert *let* for memoization and *if* for bounds-checking, as is necessary for efficiency. However, adding effects blindly renders multilevel types unsound.

We introduce the first two-level calculus with control effects and a sound type system. We give small-step operational semantics as well as a continuation-passing style (CPS) translation. For soundness, our calculus restricts the code generator's effects to the scope of generated binders. Even with this restriction, we can finally write efficient code generators for dynamic programming and numerical methods in direct style, like in algorithm textbooks, rather than in CPS or monadic style.

Categories and Subject Descriptors D.3.1 [Programming Languages]: Formal Definitions and Theory; D.3.3 [Programming Languages]: Language Constructs and Features—Control structures; F.3.3 [Logics and Meanings of Programs]: Studies of Program Constructs—Type structure

General Terms Design, Languages

Keywords Staged programming, multilevel languages, code generation, mutable state, delimited control, side effects, continuations

1. Introduction

High-performance computing and high-assurance embedded computing often call for programs that are specialized for particular

inputs, usages, or processors. Writing such programs by hand is labor-intensive and error-prone. In contrast, code generation offers a promising approach that reconciles modularity and abstraction with efficiency and safety: the programmer can write a generic program that generates specialized code and assures it safe (Hammond and Michaelson 2003; Püschel et al. 2005).

It is attractive to implement such a code generator in a multilevel language (Gomard and Jones 1991; Nielson and Nielson 1988, 1992) such as MetaOCaml (2006; Lengauer and Taha 2006), because a multilevel language offers a principled interface to a code generator for building and composing code fragments and manipulating their binding structure. The interface can guarantee that the generated code is syntactically well-formed, even well-typed and well-scoped. Multilevel languages are thus popular in applications of code generation such as partial evaluation (Gomard and Jones 1991), continuation-passing style (CPS) translation (Danvy and Filinski 1992), embedding domain-specific languages (DSLs) (Czarnecki et al. 2004; Pašalić et al. 2002), and controlling special processors (Elliott 2004; Taha 2005).

In domains whose experts are not well-versed in programming-language research, code generation can only deliver its promise if a code generator is almost as easy for a domain expert to implement as an unspecialized algorithm. Multilevel languages have gone a long way towards this goal, but not enough yet. For example, using a multilevel language to generate specialized code improves the performance and assurance of dynamic programming (Swadi et al. 2006) as well as Gaussian elimination (Carette and Kiselyov 2008), but current multilevel languages leave us with an agonizing tradeoff: our generators must either be written in CPS (Bondorf 1992; Danvy and Filinski 1990, 1992) or monadic style (Swadi et al. 2006), or use delimited control operators (Danvy and Filinski 1990, 1992; Lawall and Danvy 1994) or mutable state (Sumii and Kobayashi 2001). The first choice renders the code generators inscrutable to the typical programmer who learned unspecialized algorithms from a numerical-methods textbook, whereas the second choice voids the multilevel language's guarantee that the generated code is well-formed. In short, we cannot achieve clarity, safety, and efficiency at the same time.

Contributions Motivated by this agony, this paper introduces λ_1^\otimes , the first two-level language with delimited control operators that assures in its type system that all generated code is well-typed and well-scoped. The main innovation of the language is to maintain type soundness by restricting side effects incurred during code generation to the scope of generated binders. We have embedded the language in MetaOCaml, where the restriction has to be checked manually, and implemented it fully in Twelf. The language is a small, simplified variant of λ_{1v}^α (Kameyama et al. 2008), and the restriction on effects is also simple. Nevertheless, we can express code generators that perform *let*- and *if*-insertion—including Gaussian elimination and dynamic programming—in direct style rather

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PEPM'09, January 19–20, 2009, Savannah, Georgia, USA.
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than resorting to CPS or monadic style. We can thus use our new language to create frameworks and embedded DSLs for program generation that application programmers and domain experts can use. Our implementations of λ_1^\circledast and of direct-style code generators, including the examples of the dynamic programming specialization benchmark (Swadi et al. 2005), are all available online at <http://okmij.org/ftp/Computation/staging/README.dr>.

Organization Section 2 illustrates the challenges of code generation using the Gibonacci function in MetaOCaml. Section 3 introduces our new language, shows how its combination of delimited control and staging meets the challenges, and explains its type system. Section 4 proves that the type system is sound and delivers principal types. Section 5 presents a CPS translation for the language. Section 6 discusses related work, and Section 7 concludes.

2. Running example

Our running example is the Gibonacci function in the dynamic programming specialization benchmark (Swadi et al. 2005). It generalizes the Fibonacci function and can be written in OCaml as follows.

```
let rec gib x y n =
  if n = 0 then x else
  if n = 1 then y else
  gib x y (n-1) + gib x y (n-2)
```

There are better ways of computing Gibonacci—after all, there exists a closed formula. The code above, however, is only slightly simpler than the serious examples of dynamic programming found in the benchmark, such as longest common subsequence, binary knapsack, and optimal matrix multiplication ordering. Optimal staging of the longest common subsequence is described in Appendix A; the accompanying code deals with other examples.

To generate specialized versions of `gib` when the argument `n` is statically known, we can write the following MetaOCaml code.

```
(* val gibgen: int code -> int code -> int -> int code *)
let rec gibgen x y n =
  if n = 0 then x else
  if n = 1 then y else
  .<.(gibgen x y (n-1)) + .(gibgen x y (n-2))>.
let test_gibgen n =
  .<fun x y -> .(gibgen .<x>. .<y>. n)>.
```

A pair of *brackets* `.<e>` encloses a *future-stage* expression `e`, which is a fragment of generated code. Whereas `1 + 2` is a *present-stage* expression of type `int`, `.<1 + 2>` is a present-stage *value* of type `int code`, containing the code to add two integers.¹ To combine code values, we use *escapes* `.~e` within brackets. The escaped expression `e` is evaluated at the present stage; its result, which must be a code value, is spliced into the enclosing bracket. The inferred type of `gibgen` above describes it as a code generator that takes two code values as arguments (even open code values such as `.<x>` and `.<y>`). Brackets and escapes in MetaOCaml are thus equivalent to `next` and `prev` in λ^\circledast (Davies 1996). They are similar to *quasiquote* and *unquote* in Lisp, except a future-stage binder such as `fun x` above generates a new name and binds it in a single operation, so no generator (even if ill-typed) ever produces ill-scoped code. For example, to specialize `gib` to the case of `n` being 5, we evaluate `test_gibgen 5` to yield the value

```
.<fun x_1 -> fun y_2 ->
  (((y_2 + x_1) + y_2) + (y_2 + x_1)) +
  (y_2 + x_1) + y_2)>.
```

¹This expression actually has the type `('a,int) code` in MetaOCaml, where the type variable `'a` is an *environment classifier* (Taha and Nielsen 2003). Classifiers are not needed in this paper (see §3.1), so we elide them.

in which MetaOCaml generates the names `x_1` and `y_2` fresh. This code value has the type `(int -> int -> int) code`. Besides printing it, MetaOCaml can compile it into independently usable C or Fortran code (Eckhardt et al. 2005) or run it.

2.1 Memoization

The naively specialized `gib` code is patently inefficient like `gib` itself: the computation `y_2 + x_1` is repeated thrice. Gibonacci, as with dynamic programming algorithms, can be greatly sped up by *memoization* (Michie 1968), a form of information propagation (Sørensen et al. 1994).

The most appealing memoization method requires minimal changes in the code. The programmer only needs to rewrite the code to ‘open up the recursion’:

```
let gib x y self n =
  if n = 0 then x else
  if n = 1 then y else
  self (n-1) + self (n-2)
```

The function `gib` is no longer recursive. It receives an extra argument `self` for the recursive instance of itself. We ‘tie the knot’ with the explicit fixpoint combinator `y_simple`:

```
let rec y_simple f n = f (y_simple f) n
```

Evaluating `y_simple (gib 1 1) 5` yields 8 in the same inefficient way as before. To add memoization, we switch to a different fixpoint combinator `y_memo_m`, but keep the *same* `gib` code (McAdam 2001).

```
let y_memo_m f n =
  let table = ref (empty ()) in
  let rec memo n =
    match (lookup n !table) with
    | None -> let v = f memo n in
              (table := ext !table n v; v)
    | Some v -> v
  in f memo n
```

Just as the definition of `gib` closely follows how a textbook might describe the Gibonacci function, the definition of `y_memo_m` closely follows how a textbook might describe memoization. We assume a finite-map data-type with the operations `empty ()` to create the empty map, `lookup n table` to locate a value associated with the integer key `n`, and `ext table n v` to return a new map extending `table` by associating the key `n` to the value `v`. Now we can evaluate `y_memo_m (gib 1 1) 30`, which finishes much faster than `y_simple (gib 1 1) 30`.

This memoization method is appealing because it relegates memoization to a library of fixpoint combinators and does not distort the code of the algorithm (`gib` in our case). In a support library for dynamic programming (which was the goal of Swadi et al. (2006)), this method allows application programmers to write natural and modular code, implementing memoization strategies separately from functions to memoize.

However, this simple method does not work when specializing `gib`, for two reasons. First, the memoizing combinator `y_memo_m` must use mutation so that the two sibling calls to `self` in `gib`, with no explicit data flow between them, could reuse each other’s computation by sharing the same memoization table. When specializing memoized `gib`, the table stores code values. Alas, blindly combining mutation and staging leads to *scope extrusion*, a form of type unsoundness. For example, evaluating the expression

```
let r = ref .<1>. in
.<fun y -> .~(r := .<y>.; .<()>.)>.; !r
```

in MetaOCaml yields `.<y_1>`, a code fragment that contains an unbound variable and is thus ill-formed. Mutation and other ef-

facts such as exceptions and control defeat MetaOCaml’s guarantee that the generated code is well-formed and well-typed. Therefore, MetaOCaml does not assure that `y_memo_m` is safe to use, even though in this case it is.

The most profitable optimizations in each domain often involve a different set of combinators—for memoizing results, pivoting matrices, simplifying arithmetic, and so on (Cohen et al. 2006). Therefore, a language for code generation should empower not just a programming-language researcher but also an application programmer to create combinator libraries, including those using mutation. For such wide use of side effects, the language should assure type soundness, especially the absence of scope extrusion.

2.2 Let-insertion

Besides the risk of scope extrusion, there is a second, deeper problem: code duplication. Suppose we stage `gib` with open recursion:

```
let sgib x y self n =
  if n = 0 then x else
  if n = 1 then y else
  .<~(self (n-1)) + ~self (n-2)>.
```

Now `<fun x y -> ~self (y_memo_m (sgib .<x>. .<y>.) 5)>` produces the same inefficient specialized `gib` as before, with the computation `y2 + x1` repeated thrice. Whereas code generation is memoized, the generated code does not memoize (Bondorf and Danvy 1991). For example, we want `y_memo_m (sgib .<x>. .<y>.) 4` to return `<let t = y + x in let u = t + y in u + t>`, where no computation is duplicated. In this desired output, `self 2` should contribute the binding and use of `u`, and `self 3` those of `t`, but these contributions are not code fragments—subexpressions—that can be spliced in by escapes.

One way to insert `let` as desired is to write the code generator in CPS or monadic style (Bondorf 1992; Danvy and Filinski 1990, 1992; Swadi et al. 2006). The memoized calls to the code generator can then share the memoization table and insert `let`-bindings as necessary, without risking scope extrusion. In monadic style, the function `gib` takes the following form (Swadi et al. 2005).

```
let sgib_c x y self n =
  if n = 0 then ret x else
  if n = 1 then ret y else
  bind (self (n-2)) (fun r1 ->
  bind (self (n-1)) (fun r2 ->
  ret .<~r2 + ~r1>.)
```

We omit the definitions of the monad operations `ret` and `bind` and of the memoizing combinator that applies to `sgib_c`. All this code no longer resembles textbook algorithms, so it has lost its appeal of simplicity. Syntactic sugar for monadic code (Carette and Kiselyov 2008; Peyton Jones 2003; Wadler 1992) reduces the clutter but not the need to name intermediate results such as `r1` and `r2` above. In practice (for example, to generate Gaussian-elimination code), monadic style imposes a severe notational overhead (Carette and Kiselyov 2008) that alienates application programmers and obstructs our quest to help end users specialize their code.

2.3 If-insertion

We have seen that `let`-insertion is necessary to avoid code duplication in practical code generators and requires the unappealing use of CPS or monadic style. A similar pattern is *if-insertion* (or *assertion insertion*), illustrated below. The code generator `gen` invokes an auxiliary generator `retrieve` to extract the result of a complex computation on a working array.

```
let gen retrieve =
  .<fun array n -> (complex computation on array);
  ~self (retrieve .<array>. .<n>.)>.
```

The auxiliary generator `retrieve` receives two code values from `gen`, which represent an array and an index into it. The code generated by `retrieve` could just read the `n`-th element of array.

```
let retrieve array n = .< (~array) . (~n) >.
```

We would like, however, to check that `n` is in the bounds of `array`. We could insert the bounds check right before the array access:

```
let retrieve array n =
  .<assert (~n >= 0 && ~n < Array.length ~array);
  (~array) . (~n)>.
```

Such a check is too late: we want the check right after the array and the index are determined, before any complex computations commence. We wish the generator `gen` to yield

```
.<fun array_1 -> fun n_2 ->
  assert (n_2 >= 0 && n_2 < Array.length array_1);
  (complex computation on array_1);
  array_1.(n_2)>.
```

Again it seems impossible for `retrieve` to splice in the `assert` far from the escape in `gen`. Again this difficulty can be overcome by writing generators in CPS or monadic style, which looks foreign to the application programmer.

2.4 Delimited control and its risk of scope extrusion

Lawall and Danvy (1994) show how to use Danvy and Filinski’s *delimited control operators* `shift` and `reset` (1989, 1990, 1992) to perform `let`- and `if`-insertion in the familiar direct style, by effectively hiding trivial uses of continuations as in `sgib_c` above. Since delimited control operators are available in MetaOCaml (Kiselyov 2006), we can build a memoizing staged fixpoint combinator `y_ms` with this technique, so that evaluating

```
.<fun x y -> ~self (top_fn (fun _ ->
  y_ms (sgib .<x>. .<y>.) 5))>.
```

—using the *same* direct-style `sgib` in §2.2—gives the ideal code

```
.<fun x_1 -> fun y_2 ->
  let z_3 = y_2 in
  let z_4 = x_1 in
  let z_5 = (z_3 + z_4) in
  let z_6 = (z_5 + z_3) in
  let z_7 = (z_6 + z_5) in (z_7 + z_6)>.
```

without duplicating computations. (We describe `y_ms` and `top_fn` in §3.4.) The same delimited control operators let us accomplish `if`-insertion using the intuitive version of `gen` in §2.3.

Delimited control, however, is a side effect whose unrestricted use poses the risk of scope extrusion. For example, the expression

```
top_fn (fun _ -> .<fun x y -> ~self (
  y_ms (sgib .<x>. .<y>.) 5)>.)
```

is well-typed in MetaOCaml with `shift` and `reset` added, but it evaluates to the following code value, which disturbingly uses the variables `y2` and `x1` unbound.

```
.<let z_3 = y_2 in
  let z_4 = x_1 in
  let z_5 = (z_3 + z_4) in
  let z_6 = (z_5 + z_3) in
  let z_7 = (z_6 + z_5) in
  fun x_1 -> fun y_2 -> (z_7 + z_6)>.
```

3. Combining staging and control safely

To eliminate the risk of scope extrusion just demonstrated, we propose a simple restriction: informally, we place an implicit present-stage `reset` under each future-stage binder. Any escape under a

Variables x, y, z, f, k, n
 Expressions $e ::= i \mid e + e \mid \lambda x. e \mid \text{fix } ee \mid (e, e) \mid \text{fst} \mid \text{snd}$
 $\mid \text{ifz } e \text{ then } e \text{ else } e \mid \text{!} \mid \{e\} \mid \langle e \rangle \mid \sim e \mid x$

Figure 1. Syntax of λ_1°

Values $v^0 ::= i \mid \lambda x. e \mid \text{fix} \mid (v^0, v^0) \mid \text{fst} \mid \text{snd} \mid \text{!} \mid \langle v^1 \rangle \mid x$
 $v^1 ::= i \mid v^1 + v^1 \mid \lambda x. v^1 \mid \text{fix} \mid v^1 v^1 \mid (v^1, v^1)$
 $\mid \text{fst} \mid \text{snd} \mid \text{ifz } v^1 \text{ then } v^1 \text{ else } v^1 \mid \text{!} \mid \{v^1\} \mid x$
 Frames $F^0 ::= \square + e \mid v^0 + \square \mid \square e \mid v^0 \square \mid (\square, e) \mid (v^0, \square)$
 $\mid \text{ifz } \square \text{ then } e \text{ else } e$
 $F^1 ::= \square + e \mid v^1 + \square \mid \square e \mid v^1 \square \mid (\square, e) \mid (v^1, \square)$
 $\mid \text{ifz } \square \text{ then } e \text{ else } e \mid \text{ifz } v^1 \text{ then } \square \text{ else } e$
 $\mid \text{ifz } v^1 \text{ then } v^1 \text{ else } \square \mid \{\square\}$

Delimited contexts

$D^{00} ::= \square \mid D^{00}[F^0] \mid D^{01}[\sim \square]$
 $D^{10} ::= D^{10}[F^0] \mid D^{11}[\sim \square]$
 $D^{01} ::= D^{01}[F^1] \mid D^{00}[\langle \square \rangle]$
 $D^{11} ::= \square \mid D^{11}[F^1] \mid D^{10}[\langle \square \rangle]$

Contexts $C^0 ::= D^{00} \mid C^0[\{D^{00}\}] \mid C^1[\lambda x. D^{10}]$
 $C^1 ::= D^{01} \mid C^0[\{D^{01}\}] \mid C^1[\lambda x. D^{11}]$

Figure 2. Values and contexts

future-stage binder thus incurs no effect *observable* outside the binder’s scope. This restriction turns out not to preclude memoization, let-insertion, and if-insertion—which application programmers can now implement safely (without scope extrusion) and naturally (in direct style).

In this section, we detail our proposal by introducing a language with staging and control effects that builds in this restriction and, as we prove, prevents scope extrusion. Our language λ_1° models a subset of MetaOCaml extended with delimited control operators. Figure 1 shows the syntax: it features integer literals i and their arithmetic $+$, λ -abstractions and their applications, pairs (e_1, e_2) and their projections fst and snd . We write $\text{let } x = e_1 \text{ in } e_2$ as shorthand for $(\lambda x. e_2)e_1$. The conditional $\text{ifz } e \text{ then } e_1 \text{ else } e_2$ reduces to e_1 if e is zero, and to e_2 otherwise. The constant fix is the applicative fixpoint combinator. As usual, we identify α -equivalent terms and assume Barendregt’s variable convention. The operational semantics of these constructs is standard and call-by-value, as defined in Figures 2 and 3 in terms of small steps \rightsquigarrow and evaluation contexts C^0 . In the subsections below, we explain the staging forms $\langle e \rangle$ and $\sim e$, the level superscripts 0 and 1, the delimited control forms ! and $\{e\}$, and their interaction and typing.

We have implemented the language in Twelf, where the efficient Gibonacci generator can run. Unlike our Twelf implementation, MetaOCaml does not currently build in our restriction, so we must manually examine each escape under a future-stage binder and check that it has no observable control effect. It is possible to automate this check, either by extending MetaOCaml’s type checker or by building a separate tool like Leroy and Pessaux’s exception checker (2000).

3.1 Staging

As described in §2, our staging facility is comprised of brackets $\langle e \rangle$ and escapes $\sim e$. The staging level of an expression affects whether it is a value and how a non-value is decomposed into a

$C^0 [i_1 + i_2] \rightsquigarrow C^0 [i_1 + i_2] \quad (+)$
 $C^0 [(\lambda x. e) v^0] \rightsquigarrow C^0 [e[x := v^0]] \quad (\beta_v)$
 $C^0 [\text{fix } v^0] \rightsquigarrow C^0 [\lambda x. v^0(\text{fix } v^0)x]$
 $C^0 [\text{fst } (v_1^0, v_2^0)] \rightsquigarrow C^0 [v_1^0]$
 $C^0 [\text{snd } (v_1^0, v_2^0)] \rightsquigarrow C^0 [v_2^0]$
 $C^0 [\text{ifz } 0 \text{ then } e_1 \text{ else } e_2] \rightsquigarrow C^0 [e_1]$
 $C^0 [\text{ifz } i \text{ then } e_1 \text{ else } e_2] \rightsquigarrow C^0 [e_2] \quad \text{if } i \neq 0$
 $C^0 [\{v^0\}] \rightsquigarrow C^0 [v^0] \quad (\{\})$
 $C^1 [\sim \langle v^1 \rangle] \rightsquigarrow C^1 [v^1] \quad (\sim)$
 $C^0 [\{D^{00}[\text{!} v^0]\}] \rightsquigarrow C^0 [\{v^0(\lambda x. \{D^{00}[x]\})\}] \quad (\text{!}^0)$
 $C^1 [\lambda x. D^{10}[\text{!} v^0]] \rightsquigarrow C^1 [\lambda x. \sim \{D^{10}[\text{!} v^0]\}] \quad (\text{!}^1)$

Figure 3. Operational semantics: small-step reduction $e \rightsquigarrow e'$

context and a redex (Taha 2000). Our calculus has only two levels, present-stage and future-stage.² They correspond to two evaluation ‘modes’, reduction and code-building. To notate these levels, we put the superscripts 0 and 1 on metavariables, such as values and contexts in Figure 2.³ Brackets enclose a present-stage expression to form a future-stage expression, whereas escapes do the opposite. In particular, present-stage values v^0 include code fragments $\langle v^1 \rangle$, which are bracketed expressions containing no escapes.

A present-stage context C^0 can be *plugged* (that is, have its *hole* \square replaced) with a present-stage expression e to form a complete program $C^0[e]$, whereas a future-stage context C^1 can be plugged with a future-stage expression. As is usual in a multilevel language, these contexts may contain future-stage bindings introduced by λ , so present-stage evaluation can occur in the body of a future-stage abstraction. Contexts C^i are defined by composing *delimited contexts* D^{ij} , which can be plugged with a level- j expression to form a level- i expression. Delimited contexts are in turn defined by composing *frames* F^i , which can be plugged with a level- i expression to form a slightly larger level- i expression. In a degenerate language with neither staging nor delimited control, the superscripts would all be 0, and a context C^0 and a delimited context D^{00} would both be just a sequence of frames F^0 .

If for a moment we disregard delimited control operators (to be explained in §3.2), then the language λ_1° is almost the same as our earlier two-level staged calculus λ_1^α (Kameyama et al. 2008), but without cross-stage persistence (CSP) and without the operation run to execute generated code. It can thus be regarded as Davies’s λ° (1996) restricted to two levels. It is also similar to Nielson and Nielson’s (1988, 1992) and Gomard and Jones’s (1991) two-level λ -calculi (though the latter does not type-check generated code).

Excluding run from our language makes it simpler to implement (because the run-time system need not include a compiler and dynamic linker) and to prove sound (because the type system need not include environment classifiers (Taha and Nielsen 2003) to prevent attempts to run open code). The inability to run generated code in the language may appear severe, but it is no different from the inability of the typical compiler (especially cross-compiler) to load and run any generated code in the compiler process itself. A code generator written in λ_1° cannot run any generated code on the fly to test it, but the generated code is guaranteed to be well-typed and can be saved to a source file to be compiled and run in a separate process. That is enough for the intended use for λ_1° , namely

² More levels would clutter the notation but are probably not hard to add.

³ Our Twelf formalization marks each expression as well with its level, but we suppress those superscripts in this paper.

implementing DSL ‘compilers’ that generate families of optimized library routines—such as Gaussian elimination (Carette and Kiselyov 2008), Fast Fourier Transform (Frigo and Johnson 2005; Kiselyov and Taha 2005), linear signal processing (Püschel et al. 2005), and embedded code (Hammond and Michaelson 2003)—to be used in applications other than the generator itself.

The lack of CSP in λ_1° means that there is no ‘lift’ operation to *uniformly* convert a present-stage value of any type to some future-stage code that evaluates to that value. However, λ_1° can express lifting at specific data types—integers, pairs of integers, and such. Whereas CSP is important when using run (Taha and Nielsen 2003), it is unnecessary for mere code generation. It can even be harmful if unrestricted, because a generated library routine ought to be usable without the generator present.

3.2 Delimited control

Delimited control is realized by the *control delimiter* $\{ \}$ (pronounced ‘reset’) and the constant out (pronounced ‘shift’).

When out is not used, the expression $\{e\}$ (pronounced ‘reset e ’) is evaluated like e , as if $\{e\}$ were just shorthand for $(\lambda x.x)e$. We specify this behavior by allowing contexts C^0 to include resets $\{ \}$.

The constant out is supposed to be applied to a function value, say v^0 . When $\text{out}v^0$ is evaluated, it captures the part of the current evaluation context C^0 up to the nearest dynamically enclosing delimiter. We call this part a *delimited context* D^{00} ; unlike C^0 , it does not include reset. As the out^0 rule in Figure 3 shows, the subexpression $D^{00}[\text{out}v^0]$ reduces to the application $v^0(\lambda x.\{D^{00}[x]\})$, reifying the captured delimited context D^{00} as the abstraction $\lambda x.\{D^{00}[x]\}$.

We illustrate delimited control by using it to simulate mutable state (Filinski 1994; Kiselyov et al. 2006). We define the terms

$\text{const} = \lambda y.\lambda z.y$, $\text{get} = \text{out}(\lambda k.\lambda z.kzz)$, $\text{put} = \lambda z'.\text{out}(\lambda k.\lambda z.kz'z')$.

The reduction sequence below illustrates how const and get work.

$$\begin{aligned} \{\text{const}(\text{get} + 40)\} 2 &\rightsquigarrow_{\text{out}^0} \{(\lambda k.\lambda z.kzz)(\lambda x.\{\text{const}(x+40)\})\} 2 \\ &\rightsquigarrow_{\beta_v} \{\lambda z.(\lambda x.\{\text{const}(x+40)\})zz\} 2 \\ &\rightsquigarrow_{\{\}} \{\lambda z.(\lambda x.\{\text{const}(x+40)\})zz\} 2 \\ &\rightsquigarrow_{\beta_v} (\lambda x.\{\text{const}(x+40)\}) 2 2 \\ &\rightsquigarrow_{\beta_v} \{\text{const}(2+40)\} 2 \end{aligned}$$

The first step replaces get and its delimited context $\text{const}(\square + 40)$ by an application of $\lambda k.\lambda z.kzz$ to the function $\lambda x.\{\text{const}(x+40)\}$. The latter function is precisely the captured delimited context, enclosed in reset and reified as a function. This single step can be decomposed into a sequence of finer-grain reductions in which the out -application *bubbles up* and builds up the delimited context by local rewriting (Felleisen and Friedman 1987; Parigot 1992).

Comparing the initial and final programs in this reduction sequence shows that its net result is to replace the expression get with 2. It is as if the number 2 were stored in a cell and accessed by get in the program $\text{get} + 40$. The reductions continue to a value.

$$\{\text{const} 42\} 2 \rightsquigarrow_{\beta_v} \{\lambda z.42\} 2 \rightsquigarrow_{\{\}} (\lambda z.42) 2 \rightsquigarrow_{\beta_v} 42$$

We can mutate the state: the term $\text{put}(\text{get} + 1)$ increments the number in the cell and returns the new number.

$$\begin{aligned} \{\text{const}(\text{put}(\text{get} + 1) + \text{get})\} 2 &\rightsquigarrow^+ \{\text{const}(\text{put}(2+1) + \text{get})\} 2 \\ &\rightsquigarrow^+ \{\text{const}(\text{put} 3 + \text{get})\} 2 \\ &\rightsquigarrow^+ (\lambda x.\{\text{const}(x + \text{get})\}) 3 3 \\ &\rightsquigarrow_{\beta_v} \{\text{const}(3 + \text{get})\} 3 \end{aligned}$$

This sequence of reductions replaces the term $\text{put}(\text{get} + 1)$ with 3 and at the same time puts the new value 3 outside the reset. The result reduces to $\{\text{const}(3+3)\} 3$ and eventually 6. In general, the term $\{\text{const} e\}v^0$ behaves as if the expression e were executed in

the ‘context’ of a mutable cell initialized to v^0 . Inside e , occurrences of get retrieve the current value of the cell, and a subterm of the form $\text{out}(\lambda k.\lambda z.kz'z')$ assigns z' to the cell.

Although our language has no mutable state, we have just emulated it using delimited control. We can therefore treat a memoization table as a piece of mutable state, express the memoizing fixpoint combinator `y_memo_m` (see the accompanying code in `circle-shift.elf`), and use it to transparently memoize `gib` or another dynamic-programming algorithm in λ_1° .

For the purpose of code generation, emulating mutable state by delimited control brings two benefits. First, our core calculus is smaller and its soundness is simpler to prove. Second, the delimited nature of our control operations lets us limit the lifetime (or *dynamic extent* (Moreau 1998)) of the mutable state. In other words, we can make sure that a mutable cell is only accessed or updated during the evaluation of a particular subexpression. To prevent scope extrusion, it is crucial that our language provide this assurance both in the operational semantics (described in §3.3 below) and in the type system (described in §3.5 below). Although optimizing compilers of imperative languages can determine the extent of mutation by control-flow analyses, the results of the analyses are not expressed in the language or exposed to the programmer.

3.3 Staging and delimited control, without scope extrusion

At first glance, it appears straightforward to combine staging and delimited control. For example, the emulation of mutable state by delimited control appears to work as explained in §3.2 even if we store code values rather than integers in the mutable state and access them within escapes. For example, the following example reuses a code value using `const`, `get`, and `put`.

$$\begin{aligned} &\{\text{const}(\sim(\text{put}(8+5)) + \sim\text{get})\} \langle 0 \rangle \\ &\rightsquigarrow_{\beta_v} \{\text{const}(\sim(\text{out}(\lambda k.\lambda z.k(8+5)(8+5))) + \sim\text{get})\} \langle 0 \rangle \\ &\rightsquigarrow_{\text{out}^0} \{(\lambda k.\lambda z.k(8+5)(8+5))(\lambda x.\{\text{const}(\sim x + \sim\text{get})\})\} \langle 0 \rangle \\ &\rightsquigarrow^+ \{\text{const}(\sim\langle 8+5 \rangle + \sim\text{get})\} \langle 8+5 \rangle \\ &\rightsquigarrow_{\sim} \{\text{const}(\langle 8+5 \rangle + \sim\text{get})\} \langle 8+5 \rangle \rightsquigarrow^+ \langle 8+5 \rangle + \langle 8+5 \rangle \end{aligned}$$

Like in §3.2, `put(8+5)` assigns $\langle 8+5 \rangle$ to the mutable cell, so `get` later is replaced by $\langle 8+5 \rangle$. The final result is a piece of generated code that, when evaluated in the future stage, will add 5 to 8 twice. The only apparent difference between this emulation of mutable state and the examples in §3.2 is that captured delimited contexts, such as $\lambda x.\{\text{const}(\sim x + \sim\text{get})\}$ in the second reduction above, may span across brackets and escapes.

We now confront the two problems described in §2 that arise when memoizing code generators. The first problem is the risk of scope extrusion, which can happen when we store a code value that uses a bound variable then splice the code value outside the scope of the variable. Let us try to trigger scope extrusion in λ_1° :

$$\{\text{const}(\text{let } x = \langle \lambda y.\sim(\text{put}(y)) \rangle \text{ in } \text{get})\} \langle 0 \rangle$$

If `put(y)` above were to assign the code value $\langle y \rangle$ to the mutable cell and `get` were to retrieve that code value, then this program would generate the ill-scoped code $\langle y \rangle$. Fortunately, `put` cannot reach the mutable cell because the future-stage binder λy stands in the way. In Figure 2, this restriction is built into the definition of delimited contexts, which excludes not only present-stage resets but also future-stage binders. Our attempt at scope extrusion thus fails; in fact, the type system in §3.5 below rejects it statically. We prove that scope extrusion is impossible in §4.

The out^1 rule in Figure 3 shows that a future-stage binder acts as a control delimiter just as a present-stage reset does: a future-stage abstraction $\lambda x.e$ implicitly expands to $\lambda x.\sim\{\langle e \rangle\}$. In this regard, staging and delimited control are not orthogonal: whenever staging brings evaluation under λ , any side effect (in particular the

lifetime of mutable state) must also stay under λ . Our language prevents different future-stage scopes from sharing a memoization table, because doing so risks scope extrusion.

The second problem with memoizing code, described in §2.2, is that the generated code duplicates computations such as $8 + 5$ above. Armed with delimited control operators, we can now solve this problem by inserting `let` in the generated code without writing our code generator in CPS or monadic style. To illustrate this key idea (due to Lawall and Danvy (1994) in an untyped setting), we define the following alternative to `put`.

$$\text{put}' = \lambda z'. \text{out}(\lambda k. \lambda z. \langle \text{let } x = \sim z' \text{ in } \sim(k\langle x \rangle(x)) \rangle)$$

Using this `put'` instead of `put`, it is easy to insert `let` in the generated code to avoid duplicating computations.

$$\begin{aligned} & \{\text{const } \langle \sim(\text{put}'(8+5)) + \sim\text{get} \rangle \langle 0 \rangle \\ & \rightsquigarrow_{\beta} \{\text{const } \langle \sim(\text{out}(\lambda k. \lambda z. \langle \text{let } x = \sim(8+5) \text{ in } \sim(k\langle x \rangle(x)) \rangle) \\ & \quad + \sim\text{get} \rangle \langle 0 \rangle \\ & \rightsquigarrow_{\text{out}^0} \{(\lambda k. \lambda z. \langle \text{let } x = \sim(8+5) \text{ in } \sim(k\langle x \rangle(x)) \rangle) \\ & \quad (\lambda x. \{\text{const } \langle \sim x + \sim\text{get} \rangle \}) \langle 0 \rangle \\ & \rightsquigarrow^+ \langle \text{let } x = 8 + 5 \text{ in } \sim(\{\text{const } \langle x + \sim\text{get} \rangle \langle x \rangle \}) \\ & \rightsquigarrow^+ \langle \text{let } x = 8 + 5 \text{ in } x + x \rangle \end{aligned}$$

Instead of storing any code for reuse that may contain a complex computation, `put'` inserts a `let` to bind the result of the computation to a new variable ($x = 8 + 5$ above) that takes scope over the entire generated expression, then stores just the variable. The generated code performs the computation only once and can reuse the result.

3.4 Payoff: safe and efficient code generation in direct style

We have shown how to simulate mutable state and perform `let`-insertion using delimited control. Using these techniques, we have built the desired memoizing staged fixpoint combinator `y.ms` (see `circle-shift.elf` for the complete code and tests). Roughly,⁴ `y.ms` has the type $((\text{int} \rightarrow (\text{int})) \rightarrow \text{int} \rightarrow (\text{int})) \rightarrow \text{int} \rightarrow (\text{int})$. As this type suggests, this combinator should be applied to a code generator with open recursion, whose first argument is the recursive instance of itself, and whose second argument is a present-stage integer on which to specialize and recur. For example, recall the `sgib` function of §2.2:

$$\begin{aligned} \text{sgib} = \lambda x. \lambda y. \lambda \text{self}. \lambda n. \text{ifz } n \text{ then } x \text{ else} \\ \quad \text{ifz } n - 1 \text{ then } y \text{ else} \\ \quad \langle \sim(\text{self}(n - 1)) + \sim(\text{self}(n - 2)) \rangle \end{aligned}$$

To specialize the Gibonacci function to $n = 5$, we evaluate⁵

$$\langle \lambda x. \lambda y. \sim(\{\text{const } (y.\text{ms}(\text{sgib } \langle x \rangle \langle y \rangle) 5) \} \text{empty}) \rangle$$

(where `empty` is the empty memoization table) to obtain

$$\begin{aligned} \langle \lambda x. \lambda y. \text{let } z_3 = y \text{ in let } z_4 = x \text{ in let } z_5 = z_3 + z_4 \text{ in} \\ \quad \text{let } z_6 = z_5 + z_3 \text{ in let } z_7 = z_6 + z_5 \text{ in } z_7 + z_6 \rangle. \end{aligned}$$

This result is the ideal promised in §2.4—a linear sequence of operations without any code duplication.

Figure 4 shows our definition of `y.ms`. This fixpoint combinator simulates mutable state to maintain a memoization table that maps integer keys to previously generated code values. Therefore, it uses the table operations `empty`, `lookup`, and `ext` specified in §2.1, which are trivial to implement. Whereas `lookup` in §2.1 returns a value of type `int option`, our language λ_1° does not include `option`, so we emulate the sum type τ option by a product type

⁴ We suppress effect annotations in types until §3.5, where we introduce the type system formally.

⁵ This example reveals that `top_fn` in §2.4 is $\lambda z. \{\text{const } (z0)\} \text{empty}$.

```
y.ms = λf. f(fix (λself. λn.
  let x = out(λk. λtable.k (lookup n table) table) in
  ifz fst x
  then let y = f self n in
    out(λk. λtable. ⟨let z = ~y in ~⟨k⟨z⟩(ext table n ⟨z⟩)⟩⟩)
  else {snd x 0}))
```

Figure 4. The memoizing staged fixpoint combinator `y.ms`

$(\text{int}, \text{int} \rightarrow \tau)$: the variant `None` is represented as $(0, \text{fix } \lambda f. f)$ and the variant `Some x` as $(1, \lambda z. x)$.

When `y.ms` is applied to a user function f and that function invokes `self` on an integer argument n , our combinator retrieves the current state of the memoization table to check if code has been generated for n already. The lookup result (a pair) is bound to the variable x in Figure 4. If `fst x` is zero, meaning n is new, then the combinator invokes f to generate an expression y for n , binds y to a new future-stage variable z , and updates the memoization table to map n to $\langle z \rangle$. If the lookup succeeds (the last line of the code), the combinator returns the found value without invoking f .

In this way, we have successfully specialized the Gibonacci function in direct style as well as Gaussian elimination and Swadi et al.'s (2005) other examples. These successes show that our language is expressive enough for practical applications, despite not allowing delimited control to reach beyond any binder.

If-insertion is also within reach. To use a simpler example than in §2.3, suppose that `gen` is a code generator in λ_1° of the form $\lambda f. \langle \lambda n. e + \sim(f\langle n \rangle) \rangle$, where e is some complex computation. The argument f is an auxiliary generator, a function from code to code. Suppose that the code produced by f only makes sense if the future-stage argument n is nonzero—perhaps $f\langle n \rangle$ computes the inverse of n . We would like the generated code to check if n is nonzero before evaluating e . To achieve this goal, we can define f to be

$$\lambda n. \text{out}(\lambda k. (\text{ifz } \sim n \text{ then fail else } \sim(k\langle \text{inverse } \sim n \rangle))).$$

Passing this auxiliary generator to `gen` produces the desired code

$$\langle \lambda n. \text{ifz } n \text{ then fail else } e + \text{inverse } n \rangle.$$

The complex expression e will not be evaluated if n turns out zero.

3.5 Type system

Figure 5 displays the type system of our language λ_1° . It combines a simplification of Danvy and Filinski's type system for delimited control (1989) and a simplification of Davies's type system for staging (1996) in a sound but not orthogonal way.

The types τ of λ_1° are the base type `int`, arrow types $\tau \rightarrow \tau' / \tau_0$, product types (τ, τ') , and code types $\langle v / v_0 \rangle$. The type system is monomorphic like the simply-typed λ -calculus; we include type variables α only to state that our language has principle typings. Without impredicative effect polymorphism (Asai and Kameyama 2007), in order to write the desired code as in §3.4, we are forced to build product types into the language rather than Church-encode them. (This task is not difficult; sum types would have sufficed too.)

As a two-level language, λ_1° operates on code values in the present stage only. Hence, we require the types of future-stage expressions to be *flat*, that is, to contain no code types. Types with nested brackets such as $\langle \langle \text{int} / \text{int} \rangle / \text{int} \rangle$ are thus excluded along with terms such as $\langle \langle 42 \rangle \rangle$. A type environment Γ is a set of associations $x : \tau$ of present-stage variables x with general types τ and associations $\langle x : v \rangle$ of future-stage variables x with flat types v .

There are two judgment forms, one that assigns general types to present-stage expressions and one that assigns flat types to future-stage expressions. Both forms include *answer types* to track the control effects that may occur: in a present judgment $\Gamma \vdash e : \tau ; \tau_0$,

Type variables	α	Types	$\tau ::= \text{int} \mid \tau \rightarrow \tau' / \tau_0 \mid \langle v / v_0 \rangle \mid (\tau, \tau') \mid \alpha$	Present judgments	$\Gamma \vdash e : \tau ; \tau_0$
Flat type variables	β	Flat types	$v ::= \text{int} \mid v \rightarrow v' / v_0 \mid (v, v') \mid \beta$	Future judgments	$\Gamma \vdash e : v ; \tau_0 ; v_0$
		Environments	$\Gamma ::= [] \mid \Gamma, x : \tau \mid \Gamma, \langle x : v \rangle$		
		$\frac{}{\Gamma \vdash i : \text{int} ; \tau_0 [; v_0]}$	$\frac{\Gamma \vdash e_1 : \text{int} ; \tau_0 [; v_0] \quad \Gamma \vdash e_2 : \text{int} ; \tau_0 [; v_0]}{\Gamma \vdash e_1 + e_2 : \text{int} ; \tau_0 [; v_0]}$	$\frac{\Gamma, x : \tau \vdash e : \tau' ; \tau_1}{\Gamma \vdash (\lambda x. e) : \tau \rightarrow \tau' / \tau_1 ; \tau_0}$	$\frac{\Gamma, \langle x : v \rangle \vdash e : v' ; \langle v' / v_1 \rangle ; v_1}{\Gamma \vdash (\lambda x. e) : v \rightarrow v' / v_1 ; \tau_0 ; v_0}$
		$\frac{T = (\tau \rightarrow \tau' / \tau_2)}{\Gamma \vdash \text{fix} : (T \rightarrow T / \tau_2) \rightarrow T / \tau_1 ; \tau_0 [; v_0]}$	$\frac{\Gamma \vdash e_1 : \tau \rightarrow \tau' / \tau_0 ; \tau_0 \quad \Gamma \vdash e_2 : \tau ; \tau_0}{\Gamma \vdash e_1 e_2 : \tau' ; \tau_0}$	$\frac{\Gamma \vdash e_1 : v \rightarrow v' / v_0 ; \tau_0 ; v_0 \quad \Gamma \vdash e_2 : v ; \tau_0 ; v_0}{\Gamma \vdash e_1 e_2 : v' ; \tau_0 ; v_0}$	
		$\frac{\Gamma \vdash e : \tau ; \tau_0 [; v_0] \quad \Gamma \vdash e' : \tau' ; \tau_0 [; v_0]}{\Gamma \vdash (e, e') : (\tau, \tau') ; \tau_0 [; v_0]}$	$\frac{}{\Gamma \vdash \text{fst} : (\tau, \tau') \rightarrow \tau / \tau_1 ; \tau_0 [; v_0]}$	$\frac{}{\Gamma \vdash \text{snd} : (\tau, \tau') \rightarrow \tau' / \tau_1 ; \tau_0 [; v_0]}$	
		$\frac{\Gamma \vdash e : \text{int} ; \tau_0 [; v_0] \quad \Gamma \vdash e_1 : \tau ; \tau_0 [; v_0] \quad \Gamma \vdash e_2 : \tau ; \tau_0 [; v_0]}{\Gamma \vdash \text{ifz } e \text{ then } e_1 \text{ else } e_2 : \tau ; \tau_0 [; v_0]}$	$\frac{}{\Gamma \vdash \text{!} : ((\tau \rightarrow \tau' / \tau_1) \rightarrow \tau' / \tau') \rightarrow \tau / \tau' ; \tau_0 [; v_0]}$		
$\frac{}{\Gamma \vdash \{e\} : \tau ; \tau_0}$	$\frac{\Gamma \vdash e : \tau}{\Gamma \vdash \{e\} : \tau ; \tau_0}$	$\frac{\Gamma \vdash e : v ; \tau_0 ; v}{\Gamma \vdash \{e\} : v ; \tau_0 ; v_0}$	$\frac{\Gamma \vdash e : v ; \tau_0 ; v_0}{\Gamma \vdash \langle e \rangle : \langle v / v_0 \rangle ; \tau_0}$	$\frac{\Gamma \vdash e : \langle v / v_0 \rangle ; \tau_0}{\Gamma \vdash \sim e : v ; \tau_0 ; v_0}$	$\frac{(x : \tau) \in \Gamma}{\Gamma \vdash x : \tau ; \tau_0}$ $\frac{(\langle x : v \rangle) \in \Gamma}{\Gamma \vdash x : v ; \tau_0 ; v_0}$

Figure 5. The type system of λ_1°

the answer type is τ_0 at the present stage; in a future judgment $\Gamma \vdash e : v ; \tau_0 ; v_0$, the answer types are τ_0 at the present stage and v_0 at the future stage.⁶ The future answer type v_0 is needed to ensure that the generated code, which may incur control effects in the future stage, never goes wrong. Those type metavariables in Figure 5 with numeric subscripts (such as τ_0) are answer types that can be ignored on the first reading. Because constructs such as addition that have nothing to do with staging or delimited control are type-checked in the same way at both stages, we write $\Gamma \vdash e : \tau ; \tau_0 [; v_0]$ to mean either a present judgment (without ‘; v_0 ’) or a future judgment (with ‘; v_0 ’ and requiring τ to be flat).

An answer type is the type of the result of plugging an expression into a delimited context. In other words, an answer type is the type of an expression surrounded by a control delimiter. To take an example from §3.2, in the program $\{\text{const}(\text{get} + 40)\} 2$, the answer type of the expression `get` plugged into the delimited context $\text{const}(\square + 40)$ is the type of a function from `int` to `int`, even though the whole program has the type `int` instead. In terms of CPS, an answer type is just the codomain type of a continuation or computation. In fact, our type system is just a ‘pullback’ of the staged type system of our CPS target language in §5.

Because answer types are effect annotations, they appear not just in judgments but also in function types and code types (‘ τ_0 ’ and ‘ v_0 ’), where effects are delayed. The typing rules for $\lambda x. e$ show that the effect of e (represented by the answer types τ_1 and v_1) is incurred only when the function is invoked. The typing rules for $\langle e \rangle$ and $\sim e$ show that the future effect of a code value (represented by the answer type v_0) will be incurred only where the code value is spliced in (and never in the present stage).

An expression is *pure* if it incurs no observable control effect; a pure expression is polymorphic in its answer type(s) (Thielecke 2003). For example, it is easy to derive the judgment $\Gamma \vdash (2 + 40) : \text{int} ; \tau_0$ for an arbitrary answer type τ_0 . In words, it is safe to plug the expression `2 + 40` into any delimited context that expects an `int`, no matter what type τ_0 results from the plugging. In contrast, the expression `get + 40` incurs a control effect, as observed in §3.2. Our type system detects this effect: it derives the judgment $\Gamma \vdash (\text{get} + 40) : \text{int} ; \tau_0$ if and only if the answer type τ_0 has the form $\text{int} \rightarrow \tau' / \tau_1$. In words, it is safe to plug the expression `get + 40` into a delimited context that expects an `int` if and only if a function from `int` results from the plugging.

All values are pure. Control delimiters also make an expression pure, by masking its effect: in the typing rules for present-stage $\{e\}$ and future-stage $\lambda x. e$, the answer type τ_0 is arbitrary. The latter rule crucially forces future-stage binders to delimit present-stage control: the present-stage answer type is the code type $\langle v' / v_1 \rangle$ in the premise but arbitrary in the conclusion.

As an example, the following derivation shows that the program $\{\text{const}(\text{get} + 40)\} 2$ in §3.2 is well-typed. (Let $T = \text{int} \rightarrow \text{int} / \tau_0$ and $S = ((\text{int} \rightarrow T / \tau_0) \rightarrow T / T) \rightarrow \text{int} / T$.)

$$\begin{array}{c}
\vdots \\
k : (\text{int} \rightarrow T / \tau_0) \vdash \lambda z. k z z : T ; T \\
\hline
\boxed{\vdash} \text{!} : S ; T \quad \boxed{\vdash} \lambda k. \lambda z. k z z : (\text{int} \rightarrow T / \tau_0) \rightarrow T / T ; T \\
\hline
\boxed{\vdash} \text{get} : \text{int} ; T \\
\hline
\boxed{\vdash} \text{get} + 40 : \text{int} ; T \\
\hline
\boxed{\vdash} \text{const}(\text{get} + 40) : T ; T \\
\hline
\boxed{\vdash} \{\text{const}(\text{get} + 40)\} : T ; \tau_0 \\
\hline
\boxed{\vdash} \{\text{const}(\text{get} + 40)\} 2 : \text{int} ; \tau_0
\end{array}$$

The accompanying file `circle-shift.elf` type-checks many tests in Twelf. For example, the fixpoint combinator `y.ms` in §3.3 has the type $((\text{int} \rightarrow \langle v / v_1 \rangle) \rightarrow \text{int} \rightarrow \langle v / v_0 \rangle) \rightarrow \text{int} \rightarrow \langle v / v_0 \rangle$, in which the present-stage answer types are all $(\text{int} \rightarrow T / T) \rightarrow \langle v' / v_0 \rangle / \langle v' / v_0 \rangle$, in which $\text{int} \rightarrow T / T$ is the type of the memoization table, and the type $T = (\text{int}, \text{int} \rightarrow \langle v / v_0 \rangle / \langle v / v_0 \rangle)$ encodes the lookup result type $\langle v / v_0 \rangle$ option as explained in §3.4.

4. Formal properties

Proposition 4.1 (principal typing) If e is a term such that some judgment $\Gamma \vdash e : \tau ; \tau_0 [; v_0]$ is derivable, then some judgment $\Gamma \vdash e : \tau ; \tau_0 [; v_0]$ is derivable such that, for any derivable judgment $\Gamma' \vdash e : \tau' ; \tau'_0 [; v'_0]$, there exists a substitution θ for type variables and flat type variables so that $\Gamma' \supseteq \Gamma \theta$, $\tau' = \tau \theta$, and $\tau'_0 = \tau_0 \theta$ [and $v'_0 = v_0$].

Proof Our syntax-directed type system constitutes an algorithm to infer Γ , τ , and τ_0 [and v_0] from e using unification. \square

Proposition 4.2 (subject reduction) If $\Gamma \vdash e : \tau ; \tau_0$ is derivable and $e \rightsquigarrow e'$, then $\Gamma \vdash e' : \tau ; \tau_0$ is derivable.

Proof We first note that, if $\Gamma \vdash v^0 : \tau ; \tau_0$ is derivable, then $\Gamma \vdash v^0 : \tau ; \tau_1$ is derivable for any type τ_1 . We need a substitution

⁶For simplicity, we equate the two answer types distinguished by Danvy and Filinski (1989). The distinction is not hard to add, but not needed here.

lemma: if $\Gamma, x : \tau \vdash e : \tau' ; \tau_0 [v_0]$ and $\Gamma \vdash v^0 : \tau ; \tau_1 [v_1]$, then $\Gamma \vdash e[x := v^0] : \tau' ; \tau_0 [v_0]$. We also need a weakening lemma: if $\Gamma \vdash e : \tau ; \tau_0 [v_0]$, then $\Gamma, \Delta \vdash e : \tau ; \tau_0 [v_0]$. The proofs are routine.

Because our typing rules are all compositional, we can assume without loss of generality that C^0 and C^1 in Figure 3 are just \square . We prove the proposition by case analysis on the reduction. We show a few interesting cases.

Case β_v : Suppose $\Gamma \vdash (\lambda x. e)v^0 : \tau' ; \tau_0$. By inversion, we have $\Gamma, x : \tau \vdash e : \tau' ; \tau_0$ and $\Gamma, v^0 \vdash \tau ; \tau_0$ for some τ . Then the substitution lemma gives $\Gamma \vdash e[x := v^0] : \tau' ; \tau_0$.

Case out^0 : We have the derivation

$$\frac{\frac{\frac{\Gamma \vdash \text{out} : T \rightarrow \tau / \tau' ; \tau' \quad \Gamma \vdash v^0 : T ; \tau'}{\Gamma \vdash \text{out} v^0 : \tau ; \tau'} \quad \vdots}{\Gamma \vdash D^{00}[\text{out} v^0] : \tau' ; \tau'}{\Gamma \vdash \{D^{00}[\text{out} v^0]\} : \tau' ; \tau_0}$$

where $T = (\tau \rightarrow \tau' / \tau_1) \rightarrow \tau' / \tau'$ and the derivation from $\text{out} v^0$ to $D^{00}[\text{out} v^0]$ does not change the answer type τ' . Then we can use the weakening lemma to derive:

$$\frac{\frac{\frac{\frac{\Gamma, x : \tau \vdash x : \tau ; \tau'}{\vdots}{\Gamma, x : \tau \vdash D^{00}[x] : \tau' ; \tau'}{\Gamma, x : \tau \vdash \{D^{00}[x]\} : \tau' ; \tau_1}}{\Gamma \vdash v^0 : T ; \tau' \quad \Gamma \vdash \lambda x. \{D^{00}[x]\} : \tau \rightarrow \tau' / \tau_1 ; \tau'}{\Gamma \vdash v^0(\lambda x. \{D^{00}[x]\}) : \tau' ; \tau'}{\Gamma \vdash \{v^0(\lambda x. \{D^{00}[x]\})\} : \tau' ; \tau_0}$$

Case out^1 : Suppose $\Gamma \vdash \lambda x. D^{10}[\text{out} v^0] : v \rightarrow v' / v_1 ; \tau_0 ; v_0$. By inversion, $\Gamma, \langle x : v \rangle \vdash D^{10}[\text{out} v^0] : v' ; \langle v' / v_1 \rangle ; v_1$. Then it is easy to derive $\Gamma \vdash \lambda x. \sim\{D^{10}[\text{out} v^0]\} : v \rightarrow v' / v_1 ; \tau_0 ; v_0$. \square

Corollary 4.3 (absence of scope extrusion) If $\square \vdash e : \tau ; \tau_0$ is derivable and $e \rightsquigarrow^* e'$, then e' does not contain free variables.

Proof By induction on the number of steps from e to e' . \square

To state the next two propositions, we define the type environment $\langle \Gamma \rangle = \langle x_1 : v_1 \rangle, \dots, \langle x_n : v_n \rangle$ whenever $\Gamma = x_1 : v_1, \dots, x_n : v_n$.

Proposition 4.4 (progress) If $\langle \Gamma \rangle \vdash \{e\} : \tau ; \tau_0$ is derivable then there exists a term e' such that $\{e\} \rightsquigarrow e'$.

Proof By induction on the derivation of $\langle \Gamma \rangle \vdash \{e\} : \tau ; \tau_0$. \square

The statement of this proposition differs from the ordinary form in two respects. First, we consider terms in the form $\{e\}$ only, since a term like $\text{out} v^0$ by itself, without an enclosing control delimiter, cannot be reduced. Second, we allow a potentially non-empty environment $\langle \Gamma \rangle$, in order for the inductive proof to go through.

Propositions 4.2 and 4.4 together show that well-typed programs never go wrong in λ_1° . In particular, well-typed code generators never go wrong. Moreover, any code they generate never goes wrong either, by the following argument. If $\square \vdash \{e\} : \langle v / v_0 \rangle ; \tau_0$ is derivable, then the program $\{e\}$ either fails to terminate or evaluates to a code value $\langle v^1 \rangle$ such that $\square \vdash v^1 : v ; \tau_0 ; v_0$. The next proposition then assures us that v^1 is well-typed at the *present* stage.

Proposition 4.5 If $\langle \Gamma \rangle \vdash v^1 : v ; \tau_0 ; v_0$, then $\Gamma \vdash v^1 : v ; v_0$.

Proof By induction on the derivation of $\langle \Gamma \rangle \vdash v^1 : v ; \tau_0 ; v_0$. \square

5. CPS translation

We define a CPS translation for λ_1° . Its target is λ_1° without present-stage control effects. In other words, the terms of the target are as in λ_1° but without the control operators out and $\{ \}$ at the present stage. The type system of the target is as in λ_1° but with all present-stage answer types removed from types and judgments. We define term equality in the target language as the least congruence containing all λ_1° reductions (except $\{ \}$, out^0 , out^1) and the call-by-value η -reduction $\lambda x. ex = e$, even under present-stage λ .

First, we CPS-translate present-stage types τ to τ^* .

$$\begin{aligned} \text{int}^* &= \text{int} \quad \langle v_1 / v_2 \rangle^* = \langle v_1 / v_2 \rangle \quad (\tau_1, \tau_2)^* = (\tau_1^*, \tau_2^*) \\ (\tau_1 \rightarrow \tau_2 / \tau_3)^* &= \tau_1^* \rightarrow (\tau_2^* \rightarrow \tau_3^*) \rightarrow \tau_3^* \quad \alpha^* = \alpha \end{aligned}$$

(Future-stage types do not change.) We also translate environments.

$$\square^* = \square \quad (\Gamma, x : \tau)^* = \Gamma^*, x : \tau^* \quad (\Gamma, \langle x : v \rangle)^* = \Gamma^*, \langle x : v \rangle$$

The translation of terms depends on the level: a level- i term e translates to $\llbracket e \rrbracket_i$ for $i = 0, 1$; a level-0 value v^0 translates to $\langle v^0 \rangle$.

$$\begin{aligned} \langle v^0 \rangle_0 &= \lambda k. k \langle v^0 \rangle \\ \llbracket e_1 + e_2 \rrbracket_0 &= \lambda k. \llbracket e_1 \rrbracket_0(\lambda x. \llbracket e_2 \rrbracket_0(\lambda y. k(x+y))) \\ \llbracket e_1 e_2 \rrbracket_0 &= \lambda k. \llbracket e_1 \rrbracket_0(\lambda f. \llbracket e_2 \rrbracket_0(\lambda x. f x k)) \\ \llbracket (e_1, e_2) \rrbracket_0 &= \lambda k. \llbracket e_1 \rrbracket_0(\lambda x. \llbracket e_2 \rrbracket_0(\lambda y. k(x, y))) \\ \llbracket \text{ifz } e \text{ then } e_1 \text{ else } e_2 \rrbracket_0 &= \lambda k. \llbracket e \rrbracket_0(\lambda x. \\ &\quad \text{ifz } x \text{ then } \llbracket e_1 \rrbracket_0 k \text{ else } \llbracket e_2 \rrbracket_0 k) \\ \llbracket \{e\} \rrbracket_0 &= \lambda k. k(\llbracket e \rrbracket_0(\lambda z. z)) \\ \llbracket \langle e \rangle \rrbracket_0 &= \llbracket e \rrbracket_1 \\ \llbracket \lambda x. e \rrbracket_0 &= \lambda x. \llbracket e \rrbracket_0 \\ \llbracket \text{fix} \rrbracket_0 &= \lambda y. \lambda k. k(\text{fix}(\lambda f. \lambda x. \lambda k'. y f(\lambda z. z x k'))) \\ \langle (v_1^0, v_2^0) \rangle &= (\langle v_1^0 \rangle, \langle v_2^0 \rangle) \\ \langle p \rangle &= \lambda x. \lambda k. k(p x) \text{ where } p = \text{fst}, \text{snd} \\ \langle \text{out} \rangle &= \lambda f. \lambda k. f(\lambda x. \lambda k'. k'(k x))(\lambda z. z) \\ \langle v^0 \rangle &= v^0 \text{ for all other values } v^0 \\ \langle v^1 \rangle_1 &= \lambda k. k \langle v^1 \rangle \\ \llbracket e \oplus e' \rrbracket_1 &= \lambda k. \llbracket e \rrbracket_1(\lambda x. \llbracket e' \rrbracket_1(\lambda y. k(\sim x \oplus \sim y))) \\ &\quad \text{where } e \oplus e' \text{ is } e + e', e e', \text{ or } (e, e') \\ \llbracket \lambda x. e \rrbracket_1 &= \lambda k. k \langle \lambda x. \sim(\llbracket e \rrbracket_1(\lambda z. z)) \rangle \\ \llbracket \text{ifz } e \text{ then } e_1 \text{ else } e_2 \rrbracket_1 &= \lambda k. \llbracket e \rrbracket_1(\lambda x. \llbracket e_1 \rrbracket_1(\lambda y. \llbracket e_2 \rrbracket_1(\lambda z. \\ &\quad k(\text{ifz } \sim x \text{ then } \sim y \text{ else } \sim z)))) \\ \llbracket \{e\} \rrbracket_1 &= \lambda k. \llbracket e \rrbracket_1(\lambda x. k \langle \sim x \rangle) \\ \llbracket \langle e \rangle \rrbracket_1 &= \llbracket e \rrbracket_0 \end{aligned}$$

The output of the translation is in tail form except in $\llbracket \{e\} \rrbracket_0$, $\langle \text{out} \rangle$, and $\llbracket \lambda x. e \rrbracket_1$. If we define $\llbracket \lambda x. e \rrbracket_1 = \lambda k. \llbracket e \rrbracket_1(\lambda z. k \langle \lambda x. \sim z \rangle)$ naively in tail form, then occurrences of x in e would translate to unbound future-stage variables. The CPS translation thus relies on our treating future-stage binders as present-stage control delimiters.

Proposition 5.1 (type preservation) If the present judgment $\Gamma \vdash e : \tau ; \tau_0$ is derivable in λ_1° , then the present judgment $\Gamma^* \vdash \llbracket e \rrbracket_0 : (\tau^* \rightarrow \tau_0^*) \rightarrow \tau_0^*$ is derivable. If the future judgment $\Gamma \vdash e : v ; \tau_0 ; v_0$ is derivable in λ_1° , then the *present* judgment $\Gamma^* \vdash \llbracket e \rrbracket_1 : (\langle v / v_0 \rangle \rightarrow \tau_0^*) \rightarrow \tau_0^*$ is derivable.

Proof By mutual induction on typing derivations.

For the level-0 translation, the only interesting case is when $e = \langle e' \rangle$. Suppose $\Gamma \vdash e' : v ; \tau_0 ; v_0$. By the induction hypothesis, we have $\Gamma^* \vdash \llbracket \langle e' \rangle \rrbracket_0 = \llbracket e' \rrbracket_1 : (\langle v / v_0 \rangle \rightarrow \tau_0^*) \rightarrow \tau_0^*$.

For the level-1 translation, the interesting cases are as follows.

(Case $e = x$) Suppose $\Gamma \vdash x : v ; \tau_0 ; v_0$. Then $\langle x : v \rangle \in \Gamma$, so $\langle x : v \rangle \in \Gamma^*$. Thus, $\Gamma^* \vdash \llbracket x \rrbracket_1 = \lambda k. k \langle x \rangle : \langle v / v_0 \rangle \rightarrow \tau_0^* \rightarrow \tau_0^*$.

(Case $e = \lambda x. e'$) Suppose $\Gamma, \langle x : v'' \rangle \vdash e' : v' ; \langle v' / v_1 \rangle ; v_1$. The induction hypothesis gives $\Gamma^*, \langle x : v'' \rangle \vdash \llbracket e' \rrbracket_1 : \langle v' / v_1 \rangle \rightarrow \langle v' / v_1 \rangle$. Then $\Gamma \vdash \llbracket e \rrbracket_1 = \lambda k. k \langle \lambda x. \sim(\llbracket e' \rrbracket_1(\lambda z. z)) \rangle : \langle \langle v'' \rightarrow v' / v_1 \rangle / v_0 \rangle \rightarrow \tau_0^* \rightarrow \tau_0^*$.

(Case $e = \{e'\}$) Suppose $\Gamma \vdash e' : v ; \tau_0 ; v$. By the induction hypothesis, we have $\Gamma^* \vdash \llbracket e' \rrbracket_1 : \langle v / v \rangle \rightarrow \tau_0^* \rightarrow \tau_0^*$. Moreover, we have $\Gamma^*, x : \langle v / v \rangle \vdash \langle \{ \sim x \} \rangle : \langle v / v_0 \rangle$. Hence, we can derive $\Gamma^* \vdash \llbracket \{e'\} \rrbracket_1 = \lambda k. \llbracket e' \rrbracket_1(\lambda x. k \langle \{ \sim x \} \rangle) : \langle v / v_0 \rangle \rightarrow \tau_0^* \rightarrow \tau_0^*$. \square

Proposition 5.2 (equality preservation) If $\Gamma \vdash e : \tau ; \tau_0$ is derivable and $e \rightsquigarrow e'$, then $\llbracket e \rrbracket_0 = \llbracket e' \rrbracket_0$.

The proof of this proposition can be found in Appendix B.

We leave to future work to prove *simulation*: if $\Gamma \vdash e : \tau ; \tau$ is derivable and $\tau^* = \tau$, then the λ_1° programs $\{e\}$ and $\llbracket e \rrbracket_0(\lambda z. z)$ either both evaluate to the same value or both fail to terminate.

6. Related work

Our work draws from two strands of research on partial evaluation and code generation, namely side effects and custom generators.

There is a long tradition of using CPS to write program generators such as pattern-match compilers. Danvy and Filinski (1990, 1992) first applied delimited control to program generation: they showed how to fuse a CPS translation and administrative reductions into one pass by writing the translation either in CPS or using `shift` and `reset`. Similarly in partial-evaluation research, Bondorf (1992) showed how to improve binding times by writing the specialization rather than source programs in CPS. This move helps because the specialization is a fixed program that a programming-language expert can write and prove correct once and for all, whereas many source programs are written and fed to the specialization over time, by domain experts who may be unfamiliar with CPS.

Danvy and Filinski's CPS translations and Bondorf's specialization are sound, in the sense that their continuations are *well-behaved* and do not lead to scope extrusion. Given that these code generators were fixed, it was sensible for their authors to prove their soundness as part of specific proofs of their correctness, rather than as a corollary of some type system that assures that every well-typed generator is sound. Lawall and Danvy (1994) did not rely on such a type system either when they used `shift` and `reset` to reduce Bondorf's specialization to direct style. Our type system accepts these generators not as is but reformulated as combinators (Thiemann 1999). It thus assures them sound; in particular, it is the first to accept Danvy and Filinski's and Lawall and Danvy's uses of delimited control. In contrast, we are not aware of any sound type system for code generators that accepts Sumii and Kobayashi's specialization (2001), which performs let-insertion using mutable state rather than delimited control to speed up specialization.

Programs in particular domains often need to be optimized or specialized using specific techniques that experts of the domains can implement more readily than compiler or specialization writers. Examples include memoization for Gibonacci and dynamic programming (Swadi et al. 2006), pivoting for Gaussian elimination (Carette and Kiselyov 2008), and simplifying complex arithmetic for Fast Fourier Transform (Frigo and Johnson 2005; Kiselyov and Taha 2005). To better support these domain-specific optimizations, two approaches have been developed in the literature.

The first approach is to specialize a source language that has features (such as state) that help express custom optimizations. Along this line, Thiemann and Dussart (1999) built an offline specialization for a higher-order language with mutable references. The example source programs in their paper show how application programmers

can persuade their specialization to produce efficient code: by expressing unspecialized optimization techniques (such as memoization) and by improving binding times manually (for instance, writing a recursive coercion to transform static data into dynamic data).

As usual, Thiemann and Dussart's specialization uses continuations to perform let-insertion. What is less usual is that it is written in a store-passing style, so as to manage mutable references at specialization time. These static references are organized by a binding-time analysis (BTA) into *regions* (Talpin and Jouvelot 1992), which limit the references' lifetimes much as is rudimentarily achieved by the simulation of state by delimited control in §3. To prevent scope extrusion, the BTA ensures that a static reference is used in the scope of a dynamic binder only if the reference's lifetime is local to the binder. This constraint is analogous to our restriction of static effects (not just mutation) to the scope of dynamic binders. Whereas Thiemann and Dussart's specialization infers binding-time annotations and performs let-insertion automatically and safely, our type system (akin to their constraints on annotations) ensures the safety of code generators written by application programmers.

The last difference brings us to the second way to support domain-specific optimizations: letting domain experts write code generators. This approach has the advantage that the behavior of a code generator on a static input tends to be more predictable than the behavior of a specialization (especially its BTA) on a source program. Swadi et al.'s (2006) and Carette and Kiselyov's (2008) uses of CPS and monadic style in domain-specific code generators raise the need for a multilevel language to provide the convenience of effects without the risk of scope extrusion. Such a language is needed to ease the development and assure the safety of a variety of domain-specific code generators, not just a fixed specialization.

This paper addresses this need, following two previous papers. To prevent scope extrusion in a multilevel language with references, Calcagno et al. (2000) proposed to store only values of *closed types* in mutable cells. This (unimplemented) proposal is too restrictive for our purposes, because we want to store future-stage variables in memoization tables (as in our Gibonacci example).

We previously (Kameyama et al. 2008) introduced a typed two-level language λ_{lv}^α and translated it to System F. That translation fails in the presence of effects (due to scope extrusion, manifest as a lack of type coercions), yet it is more complex than our CPS translation in §5 here. So far, then, it seems simpler to combine staging and effects by translating effects rather than staging away.

7. Conclusions

We have presented the first language for writing code generators that provides delimited control operators while assuring statically that all generated code is well-formed. This language thus strikes a balance between clarity and safety that helps application programmers implement domain-specific optimizations in practical, reusable generators of specialized programs. The key idea that enables this balance is to restrict control effects to the scope of generated binders, that is, to treat generated binders as control delimiters.

As the examples illustrate, our language is expressive enough in many practical settings we have encountered. Nevertheless, it would be useful to find a sound way to relax our restriction on control effects, so as to perform let- and if-insertion outside the closest generated binder. We could then express loop-invariant code motion and generate assertions to be checked as early as possible. It might also help us simultaneously access multiple pieces of state at different generated scopes, not just one piece as in §3.2.

Another good way to enrich our language is to add delimited control to a richer language (like Taha and Nielsen's (2003)) with more than two levels (probably not hard), `run`, and `CSP`. Finally, our language can be made much more comfortable to use by adding polymorphism over effect annotations (Asai and Kameyama 2007).

Acknowledgments

We thank Kenichi Asai, Olivier Danvy, and Atsushi Igarashi for helpful discussions, and the reviewers for their comments.

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A. Specializing longest common subsequence

Longest common subsequence is one of the textbook dynamic-programming algorithms in Swadi et al.'s benchmark (2005). The problem is: given two sequences, find (the length of) the longest subsequence of elements that occur, in order, in both sequences. The naive implementation of the algorithm

```
let rec lcs x y (i,j) =
  if i=0 || j=0 then 0
  else if x.(i) = y.(j) then 1 + lcs x y (i-1, j-1)
  else max (lcs x y (i, j-1)) (lcs x y (i-1,j))
```

computes the length of the longest common subsequence of $x[0..i]$ and $y[0..j]$. The input sequences are specified as arrays, which can be emulated with functions in $\lambda_{\text{f}}^{\circ}$. This program is very inefficient. To make it efficient, the programmer only needs to rewrite it in the open-recursion style:

```
let lcs x y self (i,j) =
  if i=0 || j=0 then 0
  else if x.(i) = y.(j) then 1 + self (i-1, j-1)
  else max (self (i, j-1)) (self (i-1, j))
```

The rewriting preserves (and perhaps enhances) the clarity of the algorithm. Applying the memoizing fixpoint combinator $y_{\text{memo}}m$ (described in §2.1 and §3.2) gives the efficient implementation.

To specialize the algorithm when the lengths of the inputs are statically known (although their contents is not), we merely need to stage the `lcs` code:

```
let slcs x y self (i,j) =
  if i=0 || j=0 then .<0>.
  else
    .<if (.~x).(i)=(~y).(j) then 1+ .~(self (i-1,j-1))
      else max .~(self (i,j-1)) .~(self (i-1,j))>.
```

Applying the memoizing staged fixpoint combinator y_{ms} described in §2.4 and §3.3

```
.<fun x y -> .~(top_fn (fun _ ->
  y_ms (slcs .<x>. .<y>.) (3,4)))>.
```

produces the ideal code

```
.<fun x_1 -> fun y_2 ->
  let t_3 = 0 in let t_4 = 0 in let t_5 = 0 in
  let t_6 = 0 in let t_7 = 0 in let t_8 = 0 in
  let t_9 = if x_1.(1) = y_2.(1) then 1 + t_8 else max t_7 t_6 in
  let t_10 = if x_1.(1) = y_2.(2) then 1 + t_6 else max t_9 t_5 in
  let t_11 = if x_1.(1) = y_2.(3) then 1 + t_5 else max t_10 t_4 in
  let t_12 = if x_1.(1) = y_2.(4) then 1 + t_4 else max t_11 t_3 in
  ...
  let t_19 = if x_1.(3) = y_2.(1) then 1 + t_13 else max t_18 t_14 in
  let t_20 = if x_1.(3) = y_2.(2) then 1 + t_14 else max t_19 t_15 in
  let t_21 = if x_1.(3) = y_2.(3) then 1 + t_15 else max t_20 t_16 in
  if x_1.(3) = y_2.(4) then 1 + t_16 else max t_21 t_17>.
```

The complexity is $O(n \times m)$, where n and m are the lengths of the inputs, as expected of the optimal algorithm.

For comparison, to use Swadi et al.'s (2006) dynamic-programming specialization framework, Swadi et al. (2005) have to write the staged `lcs` code in a less direct monadic style:

```
let lcs_mks f ((i,j), (x,y)) =
  if (i=0 || j=0) then ret .<0>. else
  bind (f ((i-1, j-1),(x,y))) (fun r1 ->
  bind (f ((i, j-1),(x,y))) (fun r2 ->
  bind (f ((i-1, j),(x,y))) (fun r3 ->
  ret .<if ((~x).(i) = (~y).(j)) then .~(r1) + 1
    else max .~(r2) .~(r3)>..))
```

B. Proof of Proposition 5.2

We first prove the equations

$$\begin{aligned} \llbracket D^{ij}[e] \rrbracket_i &= \lambda k. \llbracket e \rrbracket_j (\lambda x. \llbracket D^{ij}[\hat{x}^j] \rrbracket_i; k) \\ \llbracket C^j[e] \rrbracket_0 &= \lambda k. \llbracket e \rrbracket_j (\lambda x. \llbracket C^j[\hat{x}^j] \rrbracket_0; k) \\ \llbracket F^j[e] \rrbracket_j &= \lambda k. \llbracket e \rrbracket_j (\lambda x. \llbracket F^j[\hat{x}^j] \rrbracket_j; k) \end{aligned}$$

where \hat{x}^j is x if $j = 0$, and $\sim x$ if $j = 1$. This is proved by simultaneous induction on the structures of contexts.

Then, to prove the proposition, it suffice to prove that, for each reduction $C^j[e] \rightsquigarrow C^j[e']$, we have $\llbracket e \rrbracket_j = \llbracket e' \rrbracket_j$. We give proofs for a few interesting cases.

Case $\{\}$: $\llbracket \{\{v^0\}\}_0 \rrbracket_0 = \lambda k. k((\lambda k'. k'(v^0))(\lambda z. z)) = \lambda k. k(v^0) = \llbracket v^0 \rrbracket_0$.

Case \sim : $\llbracket \sim \langle v^1 \rangle \rrbracket_1 = \llbracket v^1 \rrbracket_1$.

Case out^0 : We illustrate with the subcase when $D^{00} = \square e$ in the initial term $C^0[\{\{D^{00}[\text{out}^0 v^0]\}\}]$.

$$\begin{aligned} \llbracket \{\{\text{out}^0 v^0\}e\}_0 \rrbracket_0 &= \lambda k. k(\llbracket \text{out}^0 \rrbracket_0 (\lambda x. \llbracket e \rrbracket_0 (\lambda y. xy(\lambda z. z)))) \\ &= \lambda k. k(\llbracket v^0 \rrbracket_0 (\lambda x. \lambda k'. k'(\llbracket e \rrbracket_0 (\lambda y. xy(\lambda z. z)))))(\lambda z. z)) \\ &= \lambda k. k(\llbracket v^0 \rrbracket_0 (\lambda x. \{xe\})(\lambda z. z)) = \llbracket \{v^0(\lambda x. \{xe\})\}_0 \rrbracket_0 \end{aligned}$$

Case out^1 : Let e be $D^{10}[\text{out}^1 v^0]$, then compute as follows.

$$\begin{aligned} \llbracket \lambda x. \sim \langle e \rangle \rrbracket_1 &= \lambda k. k \langle \lambda x. \sim (\llbracket \langle e \rangle \rrbracket_1 (\lambda z. z)) \rangle \\ &= \lambda k. k \langle \lambda x. \sim ((\lambda k'. k'(\llbracket e \rrbracket_1 (\lambda z. z))))(\lambda z. z)) \rangle \\ &= \lambda k. k \langle \lambda x. \sim (\llbracket e \rrbracket_1 (\lambda z. z)) \rangle = \llbracket \lambda x. e \rrbracket_1 \quad \square \end{aligned}$$