# Improving supercompilation: tag-bags, rollback, speculation, normalisation, and generalisation

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#### **Abstract**

Supercompilation is a powerful technique for program optimisation and theorem proving. In this paper we describe and evaluate three improvements to the Cambridge Haskell Supercompiler (CHSC). We reduce supercompiled program size by the use of a weak normaliser and aggressive rollback, and we improve the performance of supercompiled programs by heap speculation and generalisation. Our generalisation method is simpler than those in the literature, and is better at generalising computations involving primitive operations such as those on machine integers. We also provide the first comprehensive account of the tag-bag termination mechanism.

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## 1. Overview

Supercompilation is a powerful program transformation technique due to Turchin [1] which can be used to both automatically prove theorems about programs [2] and greatly improve the efficiency with which they execute [3]. Supercompilation is capable of achieving transformations such as deforestation [4], function specialisation and constructor specialisation [5].

Despite its remarkable power, the transformation is simple, principled and fully automatic. Supercompilation is closely related to partial evaluation, but can achieve strictly more optimising transformations [6].

The key contributions of this paper are as follows:

• We briefly describe the structure of our call-by-need supercompiler<sup>1</sup>. This improves on prior work [7] in two ways. Firstly, we allow the supercompiler to tie back more often (reducing supercompiler run time and output size) by making use of a weak term normalisation procedure (Section 2.4). Secondly, we give

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the first precise account of the tag-bag termination mechanism (Section 2.1).

- We show (Section 3) how to reduce code duplication caused by supercompilation by letting the supercompiler *roll back* to a previous state at certain points.
- We describe a novel approach to term generalisation in a supercompiler that uses tags, which we call the *growing tag heuristic* (Section 4). This generalisation method is easier to implement than standard generalisation techniques.
- Any serious supercompiler for a lazy language must take care to preserve sharing; that is, it must use call-by-need rather than call-by-name. This in turn can lead to a loss of information due to work duplication concerns (Section 5). We describe a new thunk-speculating semantics that can exploit thunks, such as partial applications, for which no work is lost by duplication.
- Finally, we show a natural extension of the growing tag heuristic that allows our supercompiler to better generalise when supercompiling programs that use literals and primitive operations over them (Section 6).

## 2. Basic supercompilation

The supercompiler is an optimiser that transforms a program to a semantically-equivalent but more efficient form, by aggressive specialisation. The language we supercompile is a conventional untyped, non-strict, higher-order; its syntax is given in Figure 1. We discuss the details in due course, but terms e include the lambda calculus, plus let bindings, literals and their primitive operations (primops), and data constructors and case expressions.

We begin by reviewing the high-level structure of our supercompiler, which we call CHSC2 (for Cambridge Haskell Supercompiler). CHSC2 builds directly our previous work, CHSC1 [7], which the reader is urged to consult for further background. As well as introducing our notation and framework, we also describe several significant improvements in CHSC2 compared to CSHC1, and give the first precise account of the tag-bag approach to termination. This section will form a core upon which we will build in subsequent sections when we describe each of the improvements we have made to the basic supercompiler.

The supercompilation algorithm is as follows:

```
sc, sc' :: History \rightarrow State \rightarrow ScpM \ Term

sc \ hist = memo \ (sc' \ hist)

sc' \ hist \ state = \mathbf{case} \ terminate \ hist \ state \ \mathbf{of}

Stop \qquad \rightarrow split \ (sc \ hist) \ state

Continue \ hist' \rightarrow split \ (sc \ hist') \ (reduce \ state)
```

In the subsequent sections we will pick apart this definition and explain all the auxiliary functions it makes use of. All the the main

<sup>&</sup>lt;sup>1</sup> Full source code is available online at https://github.com/batterseapower/chsc/tree/chsc2

```
Variables x, y, z
                                  Primitives \otimes ::= +, -, ...
Data Constructors C ::= True, Just, (:), ...
Literals \ell := 1, 2, \ldots, 'a', 'b', \ldots
Values
              \lambda x. d Lambda abstraction
               l.
                         Literal
               \mathbf{C} \, \overline{x}
                         Saturated constructed data
                         Indirection to value
Terms
                                           Tagged expression
 d ::=
                                           Variable
  e ::=
              \boldsymbol{x}
                                           Values
               22
               dx
                                           Application
               d \otimes d
                                           Binary primops
               \mathbf{let} \, \overline{x = d} \, \mathbf{in} \, d
                                           Recursive let-binding
               case d of \overline{\alpha} \rightarrow \overline{d}
                                           Case decomposition
Case Alternative
 \alpha \quad ::= \quad \ell
                        Literal alternative
               \mathbf{C} \overline{x} Constructor alternative
States S := \langle H \mid e \mid K \rangle
                                       Stacks K := \overline{\kappa^t}
Heaps H := \overline{x \mapsto d}
Stack Frames
  \kappa ::= \mathbf{update} \, x
                                          Update frame
                                          Apply to function value
               case • of \overline{\alpha \rightarrow d} Scrutinise value
                                          Apply first value to primop
               \bullet \otimes d
               v^t \otimes \bullet
                                          Apply second value to primop
```

Figure 1: Syntax of the Core language and evaluator

data types and function signatures are summarised in Figure 2. In particular, the type of sc shows a unique feature of our approach to supercompilation, namely that sc takes as input the *machine states* that are the subject of the reduction rules, rather than *terms* as is more conventional. We review the importance of this choice in Section 2.4.

The main supercompiler sc is built from the following four, mostly independent, subsystems:

- The memoiser (Section 2.6). The call to memo checks whether
  the input State is equal (modulo renaming) to a State we have
  already supercompiled, or are in the process of supercompiling.
  It is this memoisation that "ties the knot" so that a recursive
  function is not specialised forever. The memoiser records its
  state in the ScpM monad.
- 2. The termination criterion (Section 2.3). With luck the memoiser will spot an opportunity to tie back, but for some functions for example, one with an accumulating parameter each recursive call looks different, so the memoiser will never encounter an identical state. So, if memo does not fire, sc' uses terminate to detect divergence (conservatively, of course). Its History argument allows terminate to accumulate the States it has seen before.
- 3. The *splitter* (Section 2.7). If the *State* fails the termination test (the *Stop* branch), the supercompiler abandons the attempt to

```
type Tag = Int
type Heap = Map \ Var \ Term -- See H in Figure 1
type Stack = [StackFrame]
data \ UStackFrame = \dots
                                   -- See \kappa in Figure 1
type StackFrame = (Tag, UStackFrame)
data UTerm = \dots
                                   -- See e in Figure 1
type Term = (Tag, UTerm) -- See d in Figure 1
data Value = \dots
                                   -- See v in Figure 1
data QA = Question Var \mid Answer Value
type State = (Heap, (Tag, QA), Stack) -- Normalised
type UState = (Heap, Term, Stack)
                                                 -- Unnormalised
free Vars :: State \rightarrow [Var]
rebuild :: State \rightarrow Term
sc :: History \rightarrow State \rightarrow ScpM Term
  -- The normaliser (Section 2.4)
normalise :: UState \rightarrow State
   -- The evaluator (Section 2.5)
step :: State \rightarrow Maybe \ UState
reduce :: State \rightarrow State
  -- The splitter (Section 2.7)
split :: Monad \ m \Rightarrow (State \rightarrow m \ Term)
                    \rightarrow State \rightarrow m \ Term
  -- Termination checking (Section 2.3)
type History = [State]
emptyHistory = [] :: History
data TermRes = Stop \mid Continue History
terminate :: History \rightarrow State \rightarrow TermRes
  -- Memoisation and the ScpM monad (Section 2.6)
memo :: (State \rightarrow ScpM \ Term)
        \rightarrow State \rightarrow ScpM \ Term
```

Figure 2: Types used in the basic supercompiler

optimise the entire term. Instead, it splits the term into a *residual* "shell" and some (smaller) sub-terms. Then it supercompiles the sub-terms and glues the results back into the shell.

4. The *evaluator* (Section 2.5). If the *State* passes the termination test (the *Continue* branch), we call *reduce* to perform symbolic evaluation of the *State*. This may take many steps, but will eventually halt (it has its own internal termination test). When it does so, we split and residualise just as before.

To get things rolling, the supercompiler is invoked as follows to supercompile an initial input Term:

```
supercompile :: Term \rightarrow Term

supercompile e = runScpM (sc emptyHistory init\_state)

\mathbf{where} \ init\_state = normalise (emptyHeap, e, [])
```

The normalise function will be discussed in Section 2.4.

#### 2.1 Tagged evaluation

A strength of our supercompiler is that it contains at its heart a call-by-need evaluator that is modularly separate from the rest of the supercompiler, and is an absolutely direct implementation of the operational semantics of the language. (In GHC, by contrast, evaluation and optimisation are intimately interwoven.)

It is important to use an *operational* semantics, because the supercompiler must be fastidious about preserving sharing: an "op-

```
\langle H \mid e \mid K \rangle \leadsto \langle H \mid e \mid K \rangle
                                                                                                        \operatorname{deref}(H[x \mapsto v], \underline{x})
                                                                                                                                    deref(H, v)
                                                                                                                deref(H, v)
                                 VAR
UPDATE
                                     APP
                                                                                                                    (\lambda x. d)^{t_{\lambda}} = \text{deref}(H, v)
BETA
BETA-N
                                    PRIM
PRIM-L
PRIM-R
                                                                                                                    \ell_i^{t_i} = \operatorname{deref}(H, v_i)
           CASE
                                                                                                                   (\mathbf{C}_j \ \overline{x}_j)^{t_1} = \operatorname{deref}(H, v)
\ell_j^{t_1} = \operatorname{deref}(H, v)
DATA
LIT
                             \langle H \mid (\text{let } \overline{x = d} \text{ in } d_{\text{body}})^t \mid K \rangle \rightsquigarrow \langle H, \overline{x \mapsto d} \mid d_{\text{body}} \mid K \rangle
LETREC
```

Figure 3: Operational semantics of tagged Core

timiser" that made programs go more slowly by losing sharing, would not be popular. In particular, the operational semantics implements *call by need* (or lazy evaluation) rather than *call by name*, thereby respecting Haskell's cost model.

Our Sestoft-style [8] operational semantics are given in Figure 3. The semantics describes transitions from one *machine state* to another. A state  $\langle H \mid e \mid K \rangle$  has the following components:

- The *heap*, *H*, is a finite mapping from variable names to the term to which that variable is bound.
- The focus term, e, is the focus of evaluation.
- The *stack*, K, describes the evaluation context of the focus term.

Much of the operational semantics is conventional, but there are three unusual features. The first is the inclusion of *indirections*, to be discussed in Section 2.2. The second unusual feature is the apparent redundancy in the inclusion of BETA-N when we already have BETA. This is necessary to support normalisation, discussed in Section 2.4.

Finally, the heap, focus term, and stack are all tagged. A tagged term (d in Figure 1) is simply a term e with a tag t, written  $e^t$ . Before supercompilation begins, the untagged input program is tagged, once and for all, with a fresh tag at every node. We will write Tag for the set of tags thus annotated on the original input term

Tags are used for two quite separate purposes in CHSC2. First, they are used to drive the termination test (Section 2.3), and second they are used to guide generalisation (Section 4). Neither is entirely new [7, 9], but the contribution of this paper is for the first time to make precise these earlier informal accounts, and to introduce some useful refinements.

The operational semantics of Figure 3 makes explicit exactly how tags are propagated during evaluation. The unbreakable rule is that *no new tags are generated*—it is this invariant that guarantees termination—but that leaves plenty of room for variations of detail. For example, PRIM-R might sensibly use the tag from either argument of the primop to tag the result, and UPDATE could tag the indirection it creates with the update frame tag rather than that of the value. The exact choice can in turn can influence both the termination test, and the effectiveness of generalisation (Section 4).

#### 2.2 Indirections

The only non-standard feature of the language is our inclusion of *indirections* in the grammar of values (Figure 1). Indirections are variables that are guaranteed to point to a *value* in the heap, rather than a possibly-unevaluated term. They never occur in input programs, and are only introduced by the UPDATE rule: when the rule inserts the value  $v^t$  of x back into the heap y, we continue with an indirection y to that value in the focus of evaluation, rather than copying the whole value from the heap into the focus.

Because values may be indirections as well as simple  $\lambda s$  or data, reduction rules such as those for  $\beta$ -reduction have to make an auxiliary deref (H,v) call to "chase pointers" through the heap to the definition of the value in the focus.

The reasons for this revised approach are twofold. Firstly, and more importantly, we found by adding indirections to the rules we could define a more useful normalising subset of the evaluation rules: see Section 2.4 for details on this. Secondly, by creating an indirection rather than copying a value outright, we can avoid duplicating the allocation of that value when we later turn the supercompiled version of the state back into a term. For example, consider this term:

let 
$$x = Just \ a; y = x$$
in case  $y$  of  $Just \_ \to f x$   $y$ 

$$Nothing \to g \ x$$

If the update rule were to copy the value rather than creating an indirection, the supercompiled output would allocate a Just twice:

let 
$$x = Just \ a; y = Just \ a \ in f \ x \ y$$

whereas by creating an indirection when we execute the update frame for y, we can get this result instead:

$$\mathbf{let}\ x = Just\ a; y = x\ \mathbf{in}\ f\ x\ y$$

#### 2.3 The termination criterion

The core of the supercompiler's termination guarantee is provided by a single function, *terminate*:

```
terminate :: History \rightarrow State \rightarrow TermRes

\mathbf{data} \ TermRes = Stop \mid Continue \ History
```

As the supercompiler proceeds, it builds up an ever-larger  ${\it History}$  of previously-observed  ${\it States}$ . This history is both interrogated

and extended by calling terminate. Termination is guaranteed by making sure that History cannot grow indefinitely. More precisely, terminate guarantees that, for any history  $h_0$  and states  $s_0, s_1, s_2, \ldots$  there can be no infinite sequence of calls to terminate of this form:

```
\begin{array}{rcl} terminate \ h_0 \ s_0 &=& Continue \ h_1 \\ terminate \ h_1 \ s_1 &=& Continue \ h_2 \end{array}
```

Instead, there will always exist some j such that:

$$terminate h_i s_i = Stop$$

In Section 2.5 we will see how *reduce* uses *terminate* to ensure that it only performs a bounded number of reduction steps. The same *terminate* function (with a different *History*) is also used sc, to ensure that sc only recurses a finite number of times, thus ensuring the supercompiler is total<sup>2</sup>.

One way to implement such a termination criterion is by defining a well-quasi-order [12]. The relation  $\unlhd \in S \times S$  is a well-quasi-order (WQO) iff for all infinite sequences of elements of S  $(s_0, s_1, \ldots)$ , it holds that:  $\exists ij.\ i < j \wedge s_i \unlhd s_j$ . Given any WQO  $\unlhd : State \times State$ , we can implement a sound terminate function:

```
type History = [State]

terminate :: History \rightarrow State \rightarrow TermRes

terminate prevs here

| any ( \le here) prevs = Stop

| otherwise = Continue (here : prevs)
```

To implement a sound WQO on *States* we follow Mitchell [9] by extracting a compact summary of the *State*, a bag of tags and comparing those *tag-bags*<sup>3</sup>:

```
s1 \leq s2 = tagBag \ s1 \leq_b tagBag \ s2
```

The relation ( $\trianglelefteq$ ) is a WQO on *States* if  $\trianglelefteq_b$  is a WQO on tag-bags. Again following Mitchell we define  $\trianglelefteq_b$  as:

$$b_1 \leq_b b_2 \iff set(b_1) = set(b_2) \land |b_1| \leq |b_2|$$

**Theorem 2.1.**  $\leq_b$  is a well-quasi-order.

We can extract a tag-bag from a State straightforwardly:

$$\begin{array}{lll} \textit{tagBag} :: \textit{State} \rightarrow \textit{TagBag} \\ \textit{tagBag} \; \big\langle H \; \middle| \; e^t \; \middle| \; K \big\rangle &=& \{\!\!\{ 2*t \; \middle| \; x \mapsto e^t \in H \}\!\!\} \\ & \cup & \{\!\!\{ 3*t \}\!\!\} \\ & \cup & \{\!\!\{ 5*t \; \middle| \; \kappa^t \in K \}\!\!\} \end{array}$$

We use  $\{\!\{\ldots\}\!\}$  notation to introduce bag literals and comprehensions with the standard meaning, and overload the set operators  $\cup$  and  $\emptyset$  to be applicable to bags. Notice carefully that we only collect the *root* tag from each heap binding, the focus term, and stack frame. We do not collect tags from internal nodes. Doing so would make the bags bigger without making the termination test more discriminating because, remembering that tags all derive from the originally-tagged input program, a node tagged t will usually have the same children tags.

We multiply tags by a different constant according to whether they arose from the heap, stack or focus, in order to prevent the termination test from failing immediately just because a reduction step has shuffled syntax between these three locations.

#### 2.4 Normalisation

Our decision to make the supercompiler optimise *States* rather than *Terms* is a consequence of our use of a *State*-based operational semantics, but it pays off elsewhere in the supercompiler

— particularly in the splitter (Section 2.7), which operates distinctively on each of the three component of the *State*.

Compared to our earlier work in CHSC1, we go further by insisting that all *States* are *normalised* by exhaustively appling all the reduction rules of Figure 3 except for the BETA rule. We still apply BETA-N during normalisation — BETA-N differs from BETA in that it is not allowed to inline the definition of a function from the heap — and it is precisely this inlining that risks divergence.

**Theorem 2.2.** The system of reduction rules excluding BETA is strongly normalising.

*Proof.* By constructing a suitable measure on states that can be shown to be strictly decreased by every rule.  $\Box$ 

Normalisation has several benefits:

 Because only normalised states are matched, trivial differences between States such as the ones described above cannot prevent tieback from occurring (Section 2.6). For example, CHSC1 suffered from increased output program size because not determine that the following States all meant the same thing:

- It reduces the number of times that we have to test the termination criteria in *reduce*, since we only risk non-termination when we perform a non-normalising reduction (see Section 2.5).
- Programs output by our supercompiler will never contain "obvious" undone case discrimination nor manifest β-redexes.

As foreshadowed in Section 2.2, the use of indirections lets us define a more natural normal form. A natural normalising semantics for an indirectionless language is that which has an unrestricted BETA rule but a *restricted* UPDATE rule that cannot duplicate lambdas. As a result, normalised states will often have syntactic  $\lambda$ -values in their focus, to the detriment of readability. In the indirection-based semantics, normalising evaluation can proceed further and continue past the update, stopping only at the point at which the function is actually applied (if any).

Normalised states are always in one of the following three forms:

$$\langle H \mid v \mid \epsilon \rangle$$
  $\langle H \mid x \mid K \rangle \ (x \notin H)$   $\langle H \mid \underline{\mathbf{f}} \mid \bullet x^t, K \rangle$ 

We therefore define the State type to be the type of normalised states, and represent the fact that the focus will only ever be a variable or a value by introducing a new sum type QA (see Figure 2). The normalise function allows a non-normalised state (UState) to be injected into the State data type in the obvious way:

 $normalise :: UState \rightarrow State$ 

## 2.5 Reduction

Normalisation performs lots of reduction, but the supercompiler still needs to perform some potentially non-normalising reduction steps in order to make good progress. We do such reductions with a function *step* that it implements the BETA reduction rule (Figure 3).

$$step :: State \rightarrow Maybe \ UState$$

If BETA fires, *step* returns an un-normalised state, *UState*; otherwise it returns *Nothing*. Typically, normalisation is then applied to the reduced result.

We can use step and normalise together to build a terminating multi-step evaluator, which in turn is called by the main supercompiler sc':

<sup>&</sup>lt;sup>2</sup> We do not prove this fact here, but it is a standard technique [10, 11].

<sup>&</sup>lt;sup>3</sup> It is simple matter to memoise the repeated use of *tagBag* on *prevs*.

```
reduce :: State \rightarrow State

reduce = go \ emptyHistory

where

go \ hist \ state = \mathbf{case} \ terminate \ hist \ state \ \mathbf{of}

Stop \rightarrow state

Continue \ hist' \rightarrow \mathbf{case} \ step \ state \ \mathbf{of}

Nothing \rightarrow state

Just \ us \rightarrow go \ hist' \ (normalise \ us)
```

The totality of reduce is achieved using the terminate function from Section 2.3. If terminate reports that evaluation appears to be diverging, reduce immediately returns. As a result, the State triple (h, qa, k) returned by reduce might not be fully reduced (though it will of course be normalised in the sense of Section 2.4) — in particular, it might be the case that  $qa = \underline{f}$  where f is bound by h.

#### 2.6 Memoisation

The purpose of the memoisation function, *memo*, is to ensure that we reuse the results of supercompiling a *State* if we come to supercompile an equivalent *State* later on.

We achieve this by using the ScpM state monad: whenever we supercompile a new State we give it a fresh name of the form  $h_n$  for some n and record the State and name in the monad as a promise. The supercompiled version of that State will be  $\lambda$ -abstracted over its free variables and bound to that name at the top level of the output program. Now if we are ever asked to supercompile a later State equivalent to that earlier one (up to renaming) we  $tie\ back$  by just looking in the promises and producing a call to the name of the earlier state, applied to appropriate arguments. More detail is given in our earlier paper [7].

## 2.7 The splitter

The job of the splitter is to complete the process of supercompiling a State whose reduction is stuck, either because of a lack of information (e.g. if the State is blocked on a free variable), or because the termination criterion is preventing us from reducing that State further. The splitter has the following type signature:

```
split :: Monad \ m \Rightarrow (State \rightarrow m \ Term)
\rightarrow State \rightarrow m \ Term
```

In general,  $(split\ opt\ s)$  identifies some sub-components of the state s, uses opt to optimise them, and combines the results into a term whose meaning is the same as s (assuming, of course, that opt preserves meaning).

A sound, but feeble, implementation of *split opt s* would be one which *never* recursively invokes *opt*:

```
split \ \_s = return \ (rebuild \ s)
```

(rebuild turns a State back into a Term; Figure 2.) Such an implementation is wildly conservative, because not even trivially reducible subexpressions will benefit from supercompilation. A good split function will residualise as little of the input as possible, using opt to optimise as much as possible. It turns out that, starting from this sound-but-feeble baseline, there is a rich variety of choices one can make for split. Space limitations preclude us from discussing split in great detail, but further details can be found in our previous paper [7] or the published source code.

To explain a little about how *split* works, we first introduce a notational device similar to that of Mitchell [9] for describing the operation of *split* on particular examples. Suppose that the following *State* is given to *split*:

```
\langle x \mapsto 1, xs \mapsto map \ (const \ 1) \ ys \ | \ x : xs \ | \ \epsilon \rangle
```

In our notation the output of split would be this "term", which has sub-components that are States:

$$\begin{array}{l} \mathbf{let}\ x = \langle \epsilon \mid 1 \mid \epsilon \rangle \, ; xs = \langle \epsilon \mid map\ (const\ 1)\ ys \mid \epsilon \rangle \\ \mathbf{in}\ x : xs \end{array}$$

You should read this in the following way:

- The part of the term outside the \( \state \) brackets\( \) is the \( \textit{residual} \) code that will form part of the output program.
- In contrast, the brackets enclose sub-States that are fed to opt for further supercompilation.

Before *split* returns, the result of supercompiling each sub-*State* is pasted into the correct position in the residual code. So the actual end result of such a supercompilation run might be something like:

let 
$$x = h2$$
;  $xs = h3$  ys in  $x : xs$ 

where h2 and h3 will have optimised bindings in the output program, as usual.

So far, we have only seen examples where  $split\ opt$  invokes opt on subterms of the original input. While this is a good approximation to what  $split\ does$ , in general, we will also want to include some of the context in which that subterm lives. Consider the following input:

$$\langle x \mapsto 1, y \mapsto x + x \mid Just \ y \mid \epsilon \rangle$$

A good way to split is as follows:

let 
$$y = \langle x \mapsto 1 \mid x + x \mid \epsilon \rangle$$
 in Just  $y$ 

Note that  $split\ opt$  decided to recursively optimise the term x+x, along with a heap binding for x taken from the context which the subterm lived in. This extra context will allow the supercompiler to reduce x+x to 2 at compile time.

Another way that a subterm can get some context added to it by *split* is when evaluation of a **case** expression gets stuck. As an example, consider the following (stuck) input to *split*:

$$\langle \epsilon \mid x \mid \mathbf{case} \bullet \mathbf{of} \ (\mathit{True} \to 1; \mathit{False} \to 2), \bullet + 3 \rangle$$

One possibility is that *split* could break the expression up for further supercompilation as follows:

$$\begin{array}{c} \mathbf{case} \ x \ \mathbf{of} \ \mathit{True} \ \rightarrow \langle \epsilon \ | \ 1 \ | \ \epsilon \rangle \\ \mathit{False} \ \rightarrow \langle \epsilon \ | \ 2 \ | \ \epsilon \rangle) + \langle \epsilon \ | \ 3 \ | \ \epsilon \rangle \end{array}$$

However, *split* can achieve rather more potential for reduction if it duplicates the stack frame performing addition into both case branches: in particular, that will mean that we are able to evaluate the addition at compile time:

case 
$$x$$
 of  $True \rightarrow \langle \epsilon \mid 1 \mid (\bullet + 3) \rangle$   
 $False \rightarrow \langle \epsilon \mid 2 \mid (\bullet + 3) \rangle$ 

In fact, in general we always push *all* of the stack frames following a case  $\bullet$  of  $\overline{\alpha} \rightarrow \overline{e}$  frame to meet with the expressions  $\overline{e}$  in the case branches.

This is one of the places where the decision to have the supercompiler work with *States* rather than *Terms* pays off: the fact that we have an explicit evaluation context makes the process of splitting at a residual **case** very systematic and easy to implement.

#### 2.8 A complete example

Here is an example of the supercompiler in action. Consider the function map, whose tagged definition is as follows:

map 
$$f$$
  $xs = (case xs^{t_1} of [] \rightarrow [] (y:ys) \rightarrow ((f y)^{t_2} : ((map^{t_3} f)^{t_4} ys)^{t_5})^{t_6})^{t_7}$ 

Now, suppose we supercompile the call  $((map^{t_a} \ not)^{t_b} \ xs)^{t_c}$ , which inverts every element in a list of booleans, xs. Remember (Section 2) that supercompile normalises the expression before

giving it to sc. Normalisation will evaluate the term until it gets stuck, which is nearly immediate, because it needs to inline map. So the initial State given to sc is this:

$$S_1 = \langle map \mapsto (\ldots)^{t_9}, not \mapsto (\ldots)^{t_8} \mid \underline{map}^{t_9} \mid \bullet \ not^{t_b}, \bullet \ xs^{t_c} \rangle$$

As this is the first invocation of sc, there is no way we can tie back, so sc' is called. The history is empty, so the termination check passes — after extending the history with the tag-bag  $\{3 * t_9, 5 * t_b, 5 * t_c, 2 * t_9, 2 * t_8\}$  — and so sc' calls reduce which evaluates the state (including inlining; see Section 2.5) until it gets stuck because it has no binding for xs:

$$\langle map \mapsto (\ldots)^{t_9}, not \mapsto (\ldots)^{t_8} \mid xs^{t_1} \mid \kappa^{t_7} \rangle$$

where  $\kappa$  is the stack frame for the case expression:

$$\kappa = \mathbf{case} \bullet \mathbf{of} \ \left\{ \begin{array}{l} [] \to [] \\ (y:ys) \to ((not \ y)^{t_2} : ((map^{t_3} \ not)^{t_4} \ ys)^{t_5})^{t_6}) \end{array} \right\}$$

Now split residualises part of the reduced State and recursively supercompiles the two branches of the case. We concentrate on the (:) branch. Once again the State constructed for this branch is normalised before being passed to the recursive invocation of sc. The normalised state looks like this:

$$\left\langle \begin{array}{l} map \mapsto (\ldots)^{t_9}, not \mapsto (\ldots)^{t_8}, \\ z \mapsto (not \ y)^{t_2}, zs \mapsto ((map^{t_3} \ not)^{t_4} \ ys)^{t_5} \end{array} \right| (z : zs)^{t_6} \left| \epsilon \right\rangle$$

We cannot tie back at this point, and the tag-bag for this state,  $\{2*t_2, 2*t_5, 3*t_6, 2*t_9, 2*t_8\}$ , is distinct (as a set) from the previous State, and so supercompilation proceeds in the Continue branch of sc' by splitting the State (reduce is the identity function on this State as it is already a value). Both the head z and tail zs of the output list are recursively supercompiled, but we focus on the tail. Normalising gives:

$$S_3 = \langle map \mapsto (\ldots)^{t_9}, not \mapsto (\ldots)^{t_8} \mid \underline{map}^{t_9} \mid \bullet not^{t_4}, \bullet xs^{t_5} \rangle$$

When sc is invoked on  $S_3$ , it notices that it has already supercompiled the  $\alpha$ -equivalent state  $S_1$ , and so it returns immediately with a Term that just invokes the corresponding h-function, h1.

The final output program (including the h4 and h5 functions generated by invocations of sc that we have elided) is thus:

$$h1 \ xs = \mathbf{case} \ xs \ \mathbf{of} \ [] \longrightarrow h4$$
 $(y:ys) \longrightarrow h2 \ y \ ys$ 
 $h2 \ y \ ys = h5 \ y:h1 \ ys$ 
 $h4 = []$ 
 $h5 \ y = not \ y$ 

After inlining functions that are called exactly once we recognise h1 as a version of map specialised for not as its first argument.

# 3. Rollback

Suppose that we apply reduce to the following term:

$$\mathbf{let} f \ x = x + f \ x \ \mathbf{in} \ f \ 2$$

Evaluation yields a sequence of terms  $f\ 2, 2+f\ 2, 2+2+f\ 2$ , and so does not terminate. Therefore, terminate will eventually say Stop, and reduce (as defined in Section 2.5) will return whatever term it has reached, say  $2+2+f\ 2$ . But since we have detected probable divergence it might be better to discard the fruitless work and  $roll\ back$  to an earlier term that has not grown so much.

Because the termination criteria is used in two ways in the supercompiler, there are two opportunities to introduce rollback — we not only add it to *reduce*, but to *sc* as well.

#### 3.1 Rolling back reduction

The most straightforward change is to the *reduce* function (Section 2.5). It would be possible for *reduce* to revert all the way to its

original input term in the event of divergence, but that risks discarding useful computation along with the bloat. For example, suppose the body of the let in the example above was id (f 2) where id is the identity function. Then it would be a pity to discard the work of reducing the call to id.

A more sophisticated approach is to modify the termination test API, so that when reporting Stop it also yields information recorded along with the earlier State that was  $\leq$  the new one:

```
type History a = [(State, a)]
emptyHistory :: History a
data TermRes a = Stop \ a \mid Continue \ (History \ a)
terminate :: History a \to State \to a \to TermRes \ a
terminate hist here here_extra
\mid prev\_extra: \bot \leftarrow [prev\_extra] \leftarrow hist
, prev \trianglelefteq here]
= Stop \ prev\_extra
\mid otherwise
= Continue \ ((here, here\_extra) : hist)
```

To allow *reduce* to rollback, we can now use the extra data field in the *History* to store the current *State* whenever the termination criteria was tested<sup>4</sup>. Should we be forced to *Stop* reduction, that stored *State* is returned instead of the latest (more-*reduced*) version. The new code may be compared with that in Section 2.5:

```
reduce :: State \rightarrow State

reduce = go emptyHistory

where

go hist state = case terminate hist state state of

Stop old_state \rightarrow old_{state}

Continue hist' \rightarrow case step state of

Nothing \rightarrow state

Just us \rightarrow go hist' (normalise\ us)
```

A simple example of where this makes a difference is when using reduce on a term such as this:

```
let loop \ xs = loop \ (1:xs); id \ x = x in id \ (loop \ [])
```

CHSC1 would produce a State such as this one:

```
let loop \ xs = loop \ (1:xs)

xs0 = []; xs1 = (:) \ 1 \ xs0

xs2 = (:) \ 1 \ xs1; xs3 = (:) \ 1 \ xs2

in loop \ xs3
```

CHSC2 instead rolls back to an earlier State where we have duplicated less code:<sup>5</sup>

```
 \begin{array}{ll} \textbf{let } loop \ xs = loop \ (1:xs); xs\theta = [\,] \\ xs1 = (:) \ 1 \ xs\theta; & xs2 = (:) \ 1 \ xs1 \\ \textbf{in } loop \ xs2 & \end{array}
```

The reduce function with rollback is, pleasingly, idempotent.

# 3.2 Rolling back driving

The other use of terminate occurs in the sc function itself, where it controls how deeply nested recursive invocations of sc can become. We would also like to roll back here, but doing so is complicated

 $<sup>^4</sup>$ It may seem redundant to store the State twice in each History entry, but this design is chosen for uniformity with Section 3.2

<sup>&</sup>lt;sup>5</sup> CHSC2 still unrolls the call to *loop* twice, whereas one unrolling might seem more reasonable. This happens because the call to *loop* in the body of the **let** is assigned a different tag to the occurrence of *loop* in the body of *loop* itself.

by the monadic structure of sc – we would like to roll back the monad-carried information as well.

The easiest way to implement this is by making ScpM an exception monad, in which rollback is triggered by throwing an exception. However, rollback should not revert to the immediately-enclosing invocation of sc but rather to the invocation that processed the State that is  $\leq$  the current state. So we need to throw an exception that will only be caught by the "right" handler. An elegant way to express this idea is with a single new primitive in the ScpM monad:

The second argument is the easy one: it is the exception handler, invoked if the first argument throws an exception. The first argument is the action to run in the scope of the exception handler, but it needs to know how to throw an exception to this particular invocation of catchScpM. So catchScpM applies its first argument to a freshly-minted "how to throw" function. This latter function takes a value of the type expected by the handler, c in this signature, and throws the exception. This signature allows the code that raises the exception to pass a value of type c to the handler, to communicate some information about the failure.

Given catchScpM, we can implement a version of sc with rollback. We make use of the same enhanced terminate function, but this time the "extra information" passed to terminate and returned by Stop is the "how to throw function".

```
type ThrowTerm = () \rightarrow ScpM \ Term

sc' :: History \ ThrowTerm \rightarrow State \rightarrow ScpM \ Term

sc' \ hist \ state

= (\lambda throw \rightarrow check \ hist \ throw) \ `catchScpM`

(\lambda() \rightarrow split \ (sc \ hist) \ state)

where

check \ hist \ throw = \mathbf{case} \ terminate \ hist \ state \ throw \ \mathbf{of}

Stop \ old\_throw \rightarrow old\_throw \ ()

Continue \ hist' \rightarrow split \ (sc \ hist') \ (reduce \ state)
```

If we are forced to terminate (the Stop branch), then instead of continuing from the current State (which triggered the termination condition), we raise an exception using the exception raiser stored with the State which "blew the whistle". When resuming execution from an exception handler, we know that supercompiling the state associated with that handler eventually caused the termination criteria to fire. Therefore, we act as if the state had failed the termination test and do not reduce it before splitting. It is remarkable how little the structure of the supercompiler is disturbed by this change.

For now, the "exception type" c in the type of catchScpM is (). However, we will need to instantiate it with a more interesting type when we come to consider the generalisation feature of CHSC2 in Section 4.

Note that the *History* at the point we raise an exception (with old\_throw) may be longer than the *History* at the point we roll back to. In fact, it is not necessary to preserve this longer history when we rollback – we can make do with the shorter history at the point the exception handler was installed. We claim that this does not affect termination of the supercompiler.

One interesting question is what should happen to the ScpM-carried information when we rollback. In particular, in between the time the exception handler was installed and when an exception is raised we may have completed supercompilation of some new h-functions – what happens to those when we roll back? One strategy

Test	SC <sup>a</sup>	Cmp.b	Run <sup>c</sup>	Mem.d	Sizee
digitsofe2	-6%	+1%	+0%	+0%	-8%
rfib	-1%	+0%	+0%	-1%	+0%
tak	-3%	+1%	+64%	+38%	+39%
treeflip	+1%	+0%	-4%	-1%	+0%
Average	-1%	+0%	+4%	+3%	+2%
Maximum	+1%	+1%	+64%	+38%	+39%
Minimum	-7%	-1%	-4%	-1%	-8%

- <sup>a</sup> Supercompilation time change when feature enabled
- <sup>b</sup> GHC compile time change when feature enabled
- <sup>c</sup> Program runtime change when feature enabled
- d Runtime allocation change when feature enabled
- e Code size change (in AST nodes) when feature enabled

**Figure 4:** The effect of enabling *reduce*-rollback

would be to discard them, on the basis that since we have rolled back they will not necessarily be used. However, we found that in practice these specialisations were often useful even after rolling back – retaining generated h-functions caused the supercompilation time of the digitsofe2 benchmark to decrease by 85%.

For this reason, our supercompiler retains as many h-functions as possible when rolling back. One subtlety is that in between the point at which the exception handler is installed and that at which the exception is raised we may have made some new promises that have not yet been fulfilled. By rolling back, we make it such that these promises will never be fulfilled – so we do have to discard any h-functions (and their dependents) that have tied back on the basis of those promises. All of this jiggery-pokery is neatly hidden away inside the implementation of catchScpM.

#### 3.3 Evaluating rollback

We tested the effects of modifying the supercompiler with both forms of rollback by observing the impact of enabling them when supercompiling the benchmark suite we will use for all performance tests in this paper:

- Seven examples from the nofib "imaginary" benchmark suite [13] (bernouilli, digitsofe2, exp3\_8, primes, rfib, tak and x2n1)
- Five standard example programs used in previous work on supercompilation and deforestation [3, 4, 9, 14] (append, factorial, raytracer, sumtree, treeflip)
- One benchmark (sumsquare) from work on stream fusion [15].

Our supercompiler (CHSC) is implemented as a preprocessor. All benchmarks are performed compiling the supercompiled program with GHC at the highest  $-\mathit{O2}$  optimisation level.

To evaluate the rollback feature, we investigate how the performance of supercompiled programs changes if we disable rollback in the final version of our supercompiler (described in Section 7).

The effects of enabling *reduce*-rollback are shown in Figure 4. We only show those few programs for which enabling the feature made a difference. This small effect an expected result, because *reduce* is stopped by the termination criteria only rarely – it is much more common that it stops because of a lack of information. Overall the effect is minimal.

As expected, we do see a reduction in the size of the digitsofe2 output program. Perhaps more surprising is the fact that for the tak benchmark the size of the output program was actually *increased* by enabling *reduce*-rollback. This change is exaggerated by the small size of tak, and occurs because enabling rollback changes the order in which bindings are generalised (Section 4). The change in heap usage occurs because this new generalisation choice just happens to produce an output program less amenable for analysis by GHC's strictness analyser, *not* because the supercompiler is deforesting less.

Test	SC	Cmp.	Run	Mem.	Size
append	-1%	+0%	+0%	+0%	+0%
bernouilli	+5%	-1%	-1%	+0%	-3%
digitsofe2	+165%	+8%	-4%	+0%	+83%
exp3_8	+2%	-4%	+4%	+0%	-59%
factorial	-1%	-1%	-3%	+0%	+0%
primes	-7%	+1%	+1%	+0%	-19%
raytracer	+0%	-1%	+0%	+0%	+0%
rfib	-1%	-1%	-1%	+0%	+0%
sumsquare	-34%	-4%	-82%	-100%	-64%
sumtree	-7%	-1%	+11%	-1%	-37%
tak	-28%	-6%	+22%	-100%	-50%
treeflip	-8%	-1%	+25%	-1%	-37%
x2n1	-4%	+0%	-1%	+0%	-22%
Average	+6%	-1%	-2%	-16%	-16%
Maximum	+165%	+8%	+25%	+0%	+83%
Minimum	-34%	-6%	-82%	-100%	-64%

**Figure 5:** The effect of enabling sc-rollback

Figure 5 shows the results of enabling sc-rollback in the supercompiler. The effect here is much more pronounced, failing to make an impact on results only for the append, factorial, raytracer and rfib benchmarks – which are precisely the three benchmarks that supercompiled cleanly without the sc termination test failing. Overall results are very encouraging: we reduce the size of the output programs by 16% on average without adverse effect on memory usage or runtime of output programs.

Indeed, we find that sc-rollback tends to have a positive effect on optimisation, despite it "undoing" some of the work of the supercompiler. One reason this happens is because the *History* is rolled back as well – giving us more opportunity for useful specialisation (e.g. in sumsquare and treeflip) than if we had continued with the (larger) history at the point we rolled back from. We also see evidence that this allows us to generate lots of new specialisations that are themselves eventually rolled back, increasing supercompilation time without corresponding increases in output size (e.g. digitsofe2).

One effect of sc-rollback is that loops are peeled and unrolled less. However, we would anyway prefer to avoid this sort of optimisation in the supercompiler because it is better done by a lower-level optimisation pass that has access to information about characteristics of the execution hardware.

## 4. Generalisation by growing tags

A shortcoming of CHSC1 was that it did not make use of the standard technique of *generalisation* to guess good induction hypotheses. Generalisation is an important heuristic for optimising programs whose supercompilation generates sequences of *States* to supercompile that do not tie back – such as those programs that make use of accumulating parameters.

## 4.1 The problem

An example where generalisation helps optimisation is *foldl*:

foldl 
$$c \ n \ xs = (\mathbf{case} \ xs^{t_1} \ \mathbf{of}$$
  
[]  $\to n$   
 $(y:ys) \to (((foldl^{t_2} \ c)^{t_3} \ (c \ n \ y)^{t_4})^{t_5} \ ys)^{t_6})^{t_7}$ 

Now, suppose we supercompile the call  $((foldl^{t_a} (+)^{t_b} n)^{t_c} xs)^{t_d}$ , which computes the sum of the elements of xs. Remember (Section 2) that supercompile normalises the expression before giving it to sc. Normalisation will evaluate the term until it gets stuck, which in this case happens nearly immediately because it needs to inline foldl. So the initial State given to sc is this:

$$S_1 = \langle H \mid \underline{foldl}^{t_8} \mid (\bullet (+))^{t_b}, (\bullet n)^{t_c}, (\bullet xs)^{t_d} \rangle$$

(In each term in this section we elide the shared heap  $H = foldl \mapsto (\dots)^{ts}$ ,  $(+) \mapsto (\dots)^{ts}$ .) Now, sc' calls reduce which inlines foldl and then gets stuck because it has no binding for xs:

$$\langle H \mid xs^{t_1} \mid \kappa^{t_7} : \epsilon \rangle$$

where  $\kappa$  is the stack frame for the case expression:

$$\kappa = \mathbf{case} \bullet \mathbf{of} \left\{ \begin{array}{l} [\;] \to n \\ (y:ys) \to (((foldl^{t_2}\;(+))^{t_3}\;(n+y)^{t_4})^{t_5}\;ys)^{t_6} \end{array} \right\}$$

Now split residualises the State and recursively supercompiles the call to foldl in the case branch. Once again this State is normalised before being passed to the recursive invocation of sc:

$$S_2 = \langle H, n1 \mapsto (n+y)^{t_4} \mid \underline{foldl}^{t_8} \mid (\bullet (+))^{t_3}, (\bullet n1)^{t_5}, (\bullet ys)^{t_6} \rangle$$

The tag-bag for  $S_1$  is  $\{5*t_b, 5*t_c, 5*t_d, 3*t_8, 2*t_8, 2*t_9\}$  and for  $S_2$  is  $\{5*t_3, 2*t_4, 5*t_5, 5*t_6, 3*t_8, 2*t_8, 2*t_9\}$ , so the termination criterion does not fire. We again reduce, and recursively supercompile the call to foldl thus revealed. Normalising once more gives,

$$S_{3} = \langle H_{3} \mid \underline{foldl}^{t_{8}} \mid (\bullet (+))^{t_{3}}, (\bullet n2)^{t_{5}}, (\bullet ys1)^{t_{6}} \rangle$$
  

$$H_{3} = H, n1 \mapsto (n + y)^{t_{4}}, n2 \mapsto (n1 + y1)^{t_{4}}$$

(We must of course freshen the variables bound by the **case**, so have renamed the variables y and ys bound by the most recent **case** stack frame to y1 and ys1 respectively.)

The tag-bag for  $S_3$  is  $\{5*t_3, 2*t_4, 2*t_4, 5*t_5, 5*t_6, 3*t_8, 2*t_8, 2*t_9\}$ . Considered as a set, this has the same tags as the tag-bag for  $S_2$ , but a greater multiplicity for  $t_4$  – the "growing tag" – so the termination test fires.

At this point, our standard supercompiler (without rollback) would finish up by splitting as follows:

$$\begin{array}{l} \mathbf{let} \ (+) = \langle (+) \mapsto \dots \mid (+) \mid \epsilon \rangle \\ n2 = \langle (+) \mapsto \dots, n1 \mapsto n+y \mid n1+y1 \mid \epsilon \rangle \\ \mathbf{in} \ \langle foldl \mapsto \dots \mid foldl \mid \epsilon \rangle \ (+) \ n2 \end{array}$$

This is hopeless: we end up merely creating an exact copy of foldl, called after one peel of the loop. What we want is to *specialise* wrt the argument that is not changing, namely (+), but *parameterise* over the argument that *is* changing, the accumulator n.

### 4.2 Our solution

The problem of how to continue when the supercompiler termination criteria fails is well known and is solved by the choice of some *generalisation* method [10, 16]. The goal of generalisation is to use the specialisations generated thus far to infer a "more general" specialisation that subsumes both of them.

Almost all supercompilers implement generalisation by computing the so-called *most specific generalisation* (MSG) between a term and that earlier term into which it embeds. However:

- The MSG is computed using terms that do not contain let bindings, which is a problem for a call-by-need supercompiler that needs to preserve let bindings in order to prevent loss of sharing. It is not totally clear how to extend the MSG to terms containing let.
- The MSG is usually only guaranteed to be non-trivial between terms that are homomorphically embedded. However, we use tag-bags instead of the homeomorphic embedding so trying to use the MSG is unlikely to give good results.

Instead, we adopt a new approach, which we call the *growing-tags heuristic*. This heuristic is particularly simple, but is as effective as any other that we have tried. The idea is that when the termination test fails there is usually at least one tag that can be "blamed" for this, in the sense that the number of occurrences of that tag has

grown since we supercompiled the prior state. In our *foldl* example, there is indeed such a tag —  $t_4$ . We can use the set of growing tags to generalise the *State* being supercompiled by *residualising* any syntax tagged with the growing tag(s) and then continuing. In our example, when the termination test fails on  $S_3$ , we would residualise the heap bindings for  $n_1$  and  $n_2$  because they are tagged (at the root) with  $t_4$ , and recursively supercompile the sub-terms as follows:

```
\begin{array}{l} \mathbf{let} \ n1 = \langle (+) \mapsto \dots \mid n+y \mid \epsilon \rangle \\ n2 = \langle (+) \mapsto \dots \mid n1+y1 \mid \epsilon \rangle \\ \mathbf{in} \ \langle (+) \mapsto \dots, foldl \mapsto \dots \mid foldl \mid \bullet \ (+), \bullet \ n2 \rangle \end{array}
```

Now, since the accumulator n2 has been residualised, the recursively supercompiled State in the body of the let can immediately tie back to the h function for  $S_1$ , and we get a loop that implements foldl. The resulting loop has been peeled once (because the tags of the initial call are different from the tags of subsequent ones), and unrolled twice (because it took two foldl inlinings before we could spot the pattern of growth).

This technique combines very nicely with rollback — with rollback enabled, we can simply force residualisation of any syntax in the *older State* that is tagged with a growing tag. So for our *foldl* example, failure of the termination test would cause us to roll-back to  $S_2$ , at which point we would notice that the n+y thunk is tagged with the growing tag  $t_4$  and thus residualise it. The resulting loop will still have been peeled once, but will not have been unrolled.

In general, it might be the case that no tag is growing with respect to the previous tag bag, which happens if and only if the latest tag-bag is exactly equal to the older one. In this case we are forced to split using the standard splitting mechanism used by CHSC1. This is analogous to the situation that occurs with a MSG-based generalisation heuristic where two terms have a trivial MSG.

The plumbing needed to implement this generalisation method can be added to the basic supercompiler in a very straightforward manner. We can replace the definition of se' from Section 3.2 with the following:

```
type Growing = Set\ Tag

type ThrowTerm = State \rightarrow ScpM\ Term

sc'\ hist\ state

= (\lambda throw \rightarrow check\ hist\ throw) 'catchScpM'

(\lambda state' \rightarrow \mathbf{case}\ findGrowing\ state\ state'\ \mathbf{of}

Nothing \rightarrow split \qquad (sc\ hist)\ state

Just\ growing \rightarrow generalise\ growing\ (sc\ hist)\ state)

where

check\ hist\ throw = \mathbf{case}\ terminate\ hist\ state\ throw\ \mathbf{of}

Stop\ old\_throw \rightarrow old\_throw\ state
```

Continue  $hist' \rightarrow split (sc \ hist') (reduce \ state)$ 

Note that we instantiated the "exception type" parameter c of catchScpM with ThrowTerm (c.f. Section 3.2).

To make use of the growing-tags information, we introduce generalise, a function similar to split, but which only residualises those parts of the input State that are marked with a growing tag (and anything that those residualised portions transitively depend on). In our implementation, generalise shares almost all of its code with split.

```
\begin{array}{c} generalise :: Growing \\ \rightarrow (State \rightarrow ScpM \ Term) \\ \rightarrow State \rightarrow ScpM \ Term \end{array}
```

Finally we can compute the growing tags themselves:

```
\begin{array}{l} \textit{findGrowing} :: \textit{State} \rightarrow \textit{State} \rightarrow \textit{Maybe Growing} \\ \textit{findGrowing s1 s2} \\ \mid \textit{setNull } q = \textit{Nothing} \end{array}
```

Test	SC	Cmp.	Run	Mem.	Size
append	-1%	-8%	+0%	+0%	+0%
bernouilli	-2%	-1%	-2%	-1%	-9%
digitsofe2	+110%	+11%	-41%	-33%	+119%
exp3_8	-64%	-4%	+0%	+0%	-49%
factorial	-1%	+0%	+0%	+0%	+0%
primes	+6%	-2%	-27%	-2%	-47%
raytracer	+0%	+0%	+0%	+0%	+0%
rfib	-2%	+0%	-1%	-1%	+0%
sumsquare	+2%	-1%	-82%	-100%	-7%
sumtree	-49%	-2%	-88%	-100%	-55%
tak	+0%	+2%	-47%	-100%	+74%
treeflip	-66%	-2%	-91%	-100%	-62%
x2n1	-38%	-2%	+5%	-84%	-45%
Average	-8%	-1%	-29%	-40%	-6%
Maximum	+110%	+11%	+5%	+0%	+119%
Minimum	-66%	-8%	-91%	-100%	-62%

Figure 6: The effect of enabling generalisation

```
| otherwise = Just g

where g = bagToSet \$ tagBag s2 `bagMinus` tagBag s1
```

In practice, there will sometimes be several growing tags, in which case supercompilation can continue if we residualise syntax tagged with *any* non-empty subset of the growing tags. The choice of exactly which subset to use — a process we call *pruning* — leaves some scope for tuning of the generalisation: we have found that a good heuristic is to residualise those tags that originate from stack frames in preference to those on any other piece of syntax.

## 4.3 Evaluating generalisation

The effects of enabling generalisation are recorded in Figure 6. The results are very good: supercompilation time, memory usage and output size almost always fall — indeed, no benchmark allocates more after this change. The size of digitsofe2 increases significantly due to extra specialisation, but it pays off in performance terms. These results underscore the importance of the choice of generalisation heuristic in supercompilation.

## 5. Speculative evaluation

A call-by-need supercompiler such as CHSC will unavoidably sometimes find itself discarding information from the *Heap* in *split*. This is because some heap bindings will both be shared and expensive to compute, and so we cannot risk duplicating the work they do. A concrete example of this would be a program such as:

```
let b = odd \ unk
in (if b then x else y, if b then y else x)
```

If we were free to duplicate the b binding into each component of the pair, we could fuse the consumption of the Bool result by the **if** expressions into odd, hence deforesting the intermediate boolean values. However, doing this would cause the unk number to be traversed by odd twice. To prevent such problems, split forces residualisation of any heap bindings that are not syntactic values.

However, the check for something being a syntactic value is too strict – many things are in fact safe to duplicate even though they are not values. A simple example is a partial application:

let 
$$f = \lambda x \ y. \ x + y; g = f \ 1$$
  
in  $(q \ 2, q \ 3)$ 

CHSC1 would produce the following output for this program:

let 
$$g = \lambda y. 1 + y$$
 in  $(g 2, g 3)$ 

The f call has been inlined, but the two calls to g have not been. This is because the g binding appears to be expensive (because

 $f\ 1$  is an application, not a value) and hence is not duplicated into the components of the pair. Of course, after supercompiling g we discover that it actually evaluates to a value – but we discover that fact too late to make use of it.

#### 5.1 Our solution

In contrast, CHSC2 uses *let-speculation* to preemptively discover that g is a value. After sc calls reduce, an auxiliary function speculate attempts to reduce any non-values in the resulting Heap to values by invoking reduce on them. If reduce reaches a value then the original binding is replaced with the new form, but if reduce fails to reach a value the original binding is retained.

Cheap expressions that are "close to" values (like f 1 in our example) will be replaced with syntactic values by the speculator, which allows split to residualise less and propagate more information downwards. The use of this technique means that unlike Mitchell [9], we do not require a separate arity analysis stage to supercompile partial applications well. Furthermore, this technique automatically achieves useful let-floating, and also allows fully-applied function calls and primop applications to be duplicated if those calls quickly reach values  $^6$ .

Using *reduce* on some *Heap* binding may itself give rise to further heap bindings requiring speculation. For example, if we speculate the expression let x = 1 + 1 in *Just* x, after reduction the outgoing heap will contain a binding for the term 1 + 1.

Naturally, we wish to speculate such bindings recursively, but implemented naïvely this creates a new source of non-termination — for example, consider speculating the expression  $enumFrom\ 1.$  The reduce call will reach a value 1:ys with new heap bindings  $y\mapsto 1+1$  and  $ys\mapsto enumFrom\ y.$  If we speculate the ys binding in turn we generate the new bindings  $z\mapsto y+1$  and  $zs\mapsto enumFrom\ z.$  We are in a loop.

To head off the resultant non-termination, we use the tag-bag termination test to check each heap binding before speculating it. If the test fails, we do not reduce, and instead roll the speculator back to point at which it was considering speculating the heap binding which blew the whistle, and retrospectively prevent reduction of that binding. This rollback is implemented by an exception-raising mechanism much the same way as described in Section 3.

An alternative to doing rollback would be to simply cease speculation at the point the termination test fails. However, doing so leads to undesirable unrolling as speculating our *enumFrom* 1 example from earlier will cause it to be unrolled twice. With rollback we detect the divergence and undo the peeling of *enumFrom*.

Rollback is also important because it ensures that *speculate* is idempotent – this is an important property, as bindings that speculation has failed to reduce to a value may be speculated again in a recursive invocation of sc – and we certainly don't want to do things like unroll an *enumFrom* call once for every time sc recurses<sup>7</sup>.

## 5.2 Evaluating speculation

Figure 7 shows the results of enabling speculation for those benchmarks where it made a difference. The results are modest because our benchmark suite contains few programs that make non-linear use of partial applications and other expressions that are "almost values" — but the added information propagation does cause a big improvement when it happens.

Test	SC	Cmp.	Run	Mem.	Size
bernouilli	+77%	+1%	+0%	+0%	+27%
digitsofe2	+208%	+16%	+1%	+0%	+146%
exp3_8	+17%	+1%	+0%	+0%	-2%
primes	+3%	-1%	-9%	+10%	+1%
rfib	-29%	-2%	+0%	-1%	+0%
sumsquare	-11%	-1%	-94%	-100%	-20%
sumtree	-28%	+0%	-1%	+0%	+5%
tak	-3%	-1%	-1%	-1%	+0%
treeflip	-28%	+0%	-3%	+0%	+6%
x2n1	-31%	-3%	+19%	-84%	-45%
Average	+14%	+1%	-7%	-14%	+9%
Maximum	+208%	+16%	+19%	+10%	+146%
Minimum	-31%	-3%	-94%	-100%	-45%

Figure 7: The effect of enabling speculation

The regression in the memory usage of primes is once again caused by an adverse interaction with GHC's strictness analyser. The growth of digitsofe2 happens because speculation of a heap binding prevents the memoiser from seeing that tieback is possible, which in turn necessitates the generation of a large number of duplicate specialisations.

## 6. Generalisation and primops

Primops shrink syntax trees, discarding tags as they do so. It turns out that discarding these tags makes it harder for the growing-tag generaliser to do a good job. A simple example of the problem occurs when supercompiling a version of *length* defined with the non-strict *foldl* defined in Section 4. Consider this term:

let 
$$next = n = n + 1$$
;  $z = 0^{t_e}$  in  $((foldl^{t_a} next^{t_b} z)^{t_c} xs)^{t_d}$ 

Supercompiling, we see the following sequence of normalised States:

Solution.
$$S_{1} = \left\langle H, z \mapsto 0^{t_{e}} \mid \underline{foldl}^{t_{8}} \mid (\bullet \ next)^{t_{b}}, (\bullet \ z)^{t_{c}}, (\bullet \ xs)^{t_{d}} \right\rangle$$

$$S_{2} = \left\langle H, z \mapsto 0^{t_{e}}, n1 \mapsto (next \ y \ z)^{t_{4}} \mid \underline{foldl}^{t_{8}} \mid$$

$$(\bullet \ next)^{t_{3}}, (\bullet \ n1)^{t_{5}}, (\bullet \ ys)^{t_{6}} \right\rangle$$

$$S_{3} = \left\langle H, n1 \mapsto 1^{t_{4}}, n2 \mapsto (next \ y1 \ n1)^{t_{4}} \mid \underline{foldl}^{t_{8}} \mid$$

$$(\bullet \ next)^{t_{3}}, (\bullet \ n2)^{t_{5}}, (\bullet \ ys1)^{t_{6}} \right\rangle$$

$$S_{4} = \left\langle H, n2 \mapsto 2^{t_{4}}, n3 \mapsto (next \ y2 \ n2)^{t_{4}} \mid \underline{foldl}^{t_{8}} \mid$$

$$(\bullet \ next)^{t_{3}}, (\bullet \ n3)^{t_{5}}, (\bullet \ ys2)^{t_{6}} \right\rangle$$

Up until  $S_4$ , supercompilation has proceeded untroubled by termination test failure. This changes when we reach  $S_4$ , as the latest tag bag is identical to that for  $S_3$  and so to ensure termination the supercompiler tries to generalise or split without reduction. Unfortunately, because we have two equal tag-bags, the supercompiler will be unable to identify a growing tag suitable for generalisation, and so will have to fall back on standard split rather than generalising away the n heap bindings as we would hope.

If we had not speculated, we would also not have the problem as n1 and n2 would remain unreduced. This would have turn caused the heap of  $S_3$  to contain z—thus triggering the termination test at the point we supercompiled  $S_3$ , and fingering  $t_4$  as the growing tag. Furthermore, the problem would not occur if we had Peano numbers in place of literals and primops, because the growing nature of the accumulator would have shown up as an increasingly deeply nested application of S that is readily detectable by the growing-tags heuristic. Interestingly, as a side effect of the work-duplication check in the splitter, we also get good code "by chance" if we supercompile a strict foldl.

#### 6.1 Our solution

Our solution to this problem is straightforward and non-invasive. The idea is that a binding such as n2 should "weigh" more heavily

<sup>&</sup>lt;sup>6</sup> Speculation of saturated applications is a particularly important feature if (like CHSC) your supercompiler introduces data constructor wrappers to deal with partial application of constructors in the input language

<sup>&</sup>lt;sup>7</sup> To improve efficiency, our real implementation keeps track of the names of previously-speculated bindings to avoid speculating them again

Test	SC	Cmp.	Run	Mem.	Size
bernouilli	+3%	+0%	-2%	-1%	-2%
digitsofe2	+136%	+15%	-41%	-33%	+133%
exp3_8	+0%	+1%	+0%	+0%	-2%
primes	+2%	-2%	-1%	+0%	-30%
rfib	-2%	-2%	+0%	-1%	+0%
sumsquare	-16%	+0%	+10%	-80%	-28%
sumtree	+1%	+0%	+0%	-1%	+0%
x2n1	-32%	-2%	+4%	-84%	-45%
Average	+7%	+1%	-3%	-15%	+2%
Maximum	+136%	+15%	+10%	+0%	+133%
Minimum	-32%	-2%	-41%	-84%	-45%

Figure 8: The effect of enabling multiplicity tagging

in the mind of the growing-tags generaliser than a binding like n1 because its literal value embodies more computational history. To this end, we add a multiplicity to the type of tags, modeling a tagbag with several reptitions of a single tag, vaguely approximating the effect of Peano arithmetic:

type 
$$Multiplicity = Int$$
  
type  $Tag = (Int, Multiplicity)$ 

Tags are initialised with an *Multiplicity* of 1. All the tagged reduction rules of Figure 3 remain the same with the exception of PRIM-R, which is replaced with the following rule:

$$\left\langle H \bigm| v_2 \bigm| (v_1 \otimes \bullet)^{(x_0,c_0)}, K \right\rangle \leadsto \left\langle H \bigm| (\otimes(\ell_1,\ell_2))^{(x_0,\sum_j c_j)} \bigm| K \right\rangle$$
 where  $\ell_i^{(x_i,c_i)} = \operatorname{deref}(H,v_i)$ 

This rule differs from the standard one in that it produces an output tag with an *Multiplicity* that has grown to be strictly greater than the tags of each of the inputs.

The final, crucial step is to make use of the Multiplicity information when constructing the TagBag:

$$\begin{array}{lll} \textit{tagBag} \, \left\langle H \;\middle|\; e^{(x,c)} \;\middle|\; K \right\rangle & = & \{\!\!\{ 2*x \;\middle|\; x \mapsto e^{(x,c)} \in H, 0 \leqslant i < c \}\!\!\} \\ & \cup & \{\!\!\{ 3*x \;\middle|\; 0 \leqslant i < c \}\!\!\} \\ & \cup & \{\!\!\{ 5*x \;\middle|\; \kappa^{(x,c)} \in K, 0 \leqslant i < c \}\!\!\} \end{array}$$

No further changes are required — because we construct TagBags with several "copies" of a tag with an Multiplicity greater than one, the growing tags heuristic identifies them as growing in just the situations where we need it to. Consider our length function example above. In  $S_3$ , the tag  $t_4$  on n1 will have an multiplicity of 3, and that on n2 will be 1. By the time we reach  $S_4$  the tag  $t_4$  on n2 will have a count of 5 while the tag on n3 will be 1. Looking at the resulting tag bags, it is clear that  $t_4$  is the growing tag and hence should serve as the basis of residualisation by the growing-tags heuristic.

#### 6.2 Evaluating multiplicity tagging

In Figure 8 we show the effects of enabling our multiplicity tagging system for those programs that were affected by the change – as you might expect, only programs making use of primops and literals saw a change. One of the most dramatic results is for sumsquare, where the newly-discovered generalisation causes all of the lists allocated by the benchmark to be fused away, greatly improving memory usage and runtime. However, there are solid gains in runtime, memory usage and output size for all primopusing benchmarks — all originating from better generalisation.

## 7. Overall results

Our latest version of the Cambridge Haskell Supercompiler, CHSC2, incorporates all of the refinements described above: generalisation, rollback, speculation, and multiplicity tagging. We compare our

results to Supero 2010 [9] in Figure 9. The main difference is that CHSC2 discovers a better generalisation than Supero 2010 for treeflip, accounting for its ability to vastly reduce allocations there. It is not clear why CHSC's versions of digitsofe2 and primes fail to reduce memory allocation by as much as Supero. Stripping out the effect of tak, where Supero is unfairly penalised by the areforementioned strictness-analyser interaction, we obtain slighly better average memory consumption reduction (-41% vs -38%) and runtime reduction (-36% vs -30%).

Encouragingly, only tak and exp3\_8 got worse after supercompilation. Unfortunately, even after inspection of the supercompiled program it is unclear why the memory usage (and hence runtime) of exp3\_8 is made worse by supercompilation.

## 8. Related work

The tag-bag termination test was introduced by Mitchell [9]. The other major approach is to use a homeomorphic embedding on syntax trees [12] but supercompilers that use that method tend to spend most of their time evaluating the test [17].

Supero 2010 [9] used a generalisation mechanism for call-byneed supercompilers that use the tag-bag termination mechanism. The idea is that when computing a child term for recursive supercompilation, the splitting process avoids pushing down any bindings that would cause the new child state to immediately fail the termination check. We found that Supero's generalisation method gives very similar results to our method in most situations. However, our method has two clear merits:

- It is easier to implement, because the splitter does not need to try inlining bindings in any particular order the growing tags tell you exactly those bindings which may be inlined.
- It is faster: Supero's method requires one termination test to be carried out for every binding you may wish to inline, whereas our method simply requires a set membership test per inlining.

The effect of rollback on the sc is present in standard supercompilers constructed around the idea of a "graph of configurations", such as HOSC [18]. In such systems, when an earlier graph node a is embedded into a later node b, the a node (rather than the b node) is generalised. This has the effect of cutting off the part of the graph reachable via a, achieving rollback. We have described how this idea can be applied to a direct-style supercompiler, as well as how to apply the concept to "loopy" reduction and heap speculation.

Our decision to use speculative evaluation in the supercompiler was initially inspired by Ennals [19], though runtime speculation faces very different tradeoffs and design issues.

## 9. Conclusions and further work

We have described a highly-modular supercompiler whose performance is comparable to or better than prior work, with an average speedup and reduction in memory usage of 35%. We have shown how supercompilation can be improved by a number of local improvements to our earlier modular algorithm. By adding rollback to undo wasted supercompilation, we reduced both output program memory consumption and size by 16%. By adding a speculator for heap bindings, we improved information propagation and hence got more deforestation, reducing memory usage by another 14% on average. We also showed how the growing-tags heuristic could be used in a tag-bag based supercompiler to implement generalisation, reducing heap usage by 40%. Furthermore, we described how a supercompiler can make use of ubiquitously-normalised terms to help ensure that the output program never contains "obvious" reductions, and gave the first precise treatment of a tagged reduction semantics of the sort that is necessary for a tag-bag based supercompiler.

Test	Mitchell [9]				CHSC2						
Test	SC <sup>a</sup>	Cmp.b	Run <sup>c</sup>	Mem.d	Sizee	SC <sup>a</sup>	Cmp.b	Run <sup>c</sup>	Mem.d	Sizee	
append	0.0s	+2%	-15%	-15%	+29%	0.0s	+0%	-11%	-12%	+170%	
bernouilli	4.2s	+80%	-1%	-3%	+276%	0.1s	+5%	-5%	-6%	+162%	
digitsofe2	3.1s	+14%	-56%	-53%	+15%	1.8s	+30%	-43%	-37%	+952%	
exp3_8	0.6s	+18%	+1%	+0%	+559%	0.0s	+2%	+6%	+11%	+119%	
factorial	0.0s	-3%	+1%	+0%	-23%	0.0s	-1%	-1%	+0%	+19%	a Supercompilation time
primes	0.0s	+2%	-38%	-23%	-21%	0.0s	-1%	-40%	-9%	+9%	<sup>b</sup> GHC compile time vs. GHC $-O2$
raytracer	0.0s	+1%	-42%	-56%	+54%	0.0s	-2%	-45%	-55%	+64%	<sup>c</sup> Program runtime vs. GHC – O2
rfib	0.0s	+1%	-11%	+0%	-13%	0.0s	+0%	-28%	-1%	+125%	<sup>d</sup> Runtime allocation vs. GHC $-02$
sumsquare	13.8s	+28%	-62%	-100%	+638%	0.0s	+0%	-98%	-100%	+71%	e Size increase (in AST nodes) due to
sumtree	0.0s	+0%	-83%	-100%	+50%	0.0s	+0%	-90%	-100%	+60%	supercompilation
tak	0.0s	+3%	-38%	+23018%	-41%	0.0s	+2%	-15%	+37%	+229%	1 1
treeflip	0.0s	+1%	-44%	-45%	+99%	0.0s	+0%	-90%	-100%	+52%	
x2n1	0.0s	+4%	-13%	-66%	+39%	0.0s	+0%	+5%	-84%	+35%	
Average		+12%	-31%	+1735%	+128%		+3%	-35%	-35%	+159%	
Maximum		+80%	+1%	+23018%	+638%		+30%	+6%	+37%	+952%	
Minimum		-3%	-83%	-100%	-41%		-2%	-98%	-100%	+9%	

Figure 9: Overall benchmark results

We have not yet proven that our modified supercompiler terminates, though we have taken care to avoid sources of non-termination in every component of our design. The supercompiler does terminate on all examples we have tried. Unfortunately, it does not seem possible to directly reuse our previous termination from [7] because of our use of term normalisation, so an updated (and elaborated) termination proof is an obvious line of further work.

An interesting direction would be to compare our generalisation heuristic with the MSG, and do a more complete comparison with Supero 2010's generalisation.

We hope to incorporate a supercompiler into GHC itself so we can experiment with supercompiling larger, real world programs. To supercompile arbitrary programs, we are exploring means to control the explosive growth in the number of distinct specialisations that occurs for many common examples.

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