

Asymptotic Improvement through Delimited Control

Fast Generic Search with Effect Handlers

Daniel Hillerström

Laboratory for Foundations of Computer Science
School of Informatics
The University of Edinburgh, UK

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(Joint work with Sam Lindley and John Longley)

The Fundamental Efficiency of Effect Handlers

We consider whether a language with effect handlers admit essential expressiveness differences over a “pure” language.

The question

Let \mathcal{L}_{eff} a language with effect handlers, and $\mathcal{L} \subset \mathcal{L}_{eff}$ the fragment modulo effect handlers. Does \mathcal{L}_{eff} admit asymptotically more efficient programs than \mathcal{L} ?

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Spoiler alert: the answer is **YES**. Specifically $\mathcal{O}(2^n)$ vs $\Omega(n2^n)$.

To answer positively, it suffices to find one such program. We shall use *generic search* as our program.

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Take \mathcal{L} to be cbv PCF and endow it with effect handlers to obtain \mathcal{L}_{eff} .

The Generic Search Problem

Problem: Given a boolean-valued predicate P on a space \mathbb{B}^n of boolean vectors of length n (for some fixed $n \in \mathbb{N}$), return the number of such vectors p for which $P(p) = \text{true}$. Thus for each n , we ask for an implementation of

$$\text{count}_n : ((\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}) \rightarrow \text{Nat}$$

There is but one rule:

No change of types is allowed! (Longley and Normann 2015)

This rules out tricks such as

- CPS conversion
- Implementing an interpreter for \mathcal{L}_{eff} in \mathcal{L}

Example predicates and their models I

A boring constant predicate

$$tt_0 : (\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}$$
$$tt_0 \doteq \lambda p.\text{true}$$

Admits a with no queries model

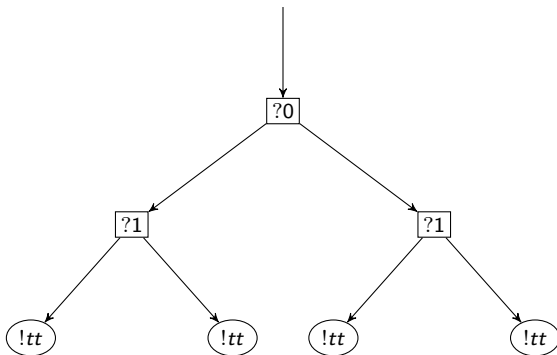


Example predicates and their models II

A slightly more interesting constant predicate

$$tt_2 : (\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}$$
$$tt_2 \doteq \lambda p.p\ 0; p\ 1; \text{true}$$

Admits a finite model with no repeated queries



Example predicates and their models III

A non-constant predicate

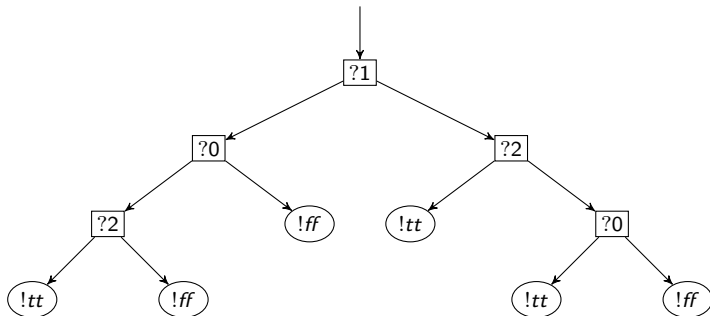
$tf_3 : (\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}$

$tf_3 \doteq \lambda p. \text{if } p \ 1$

then if $p \ 0$ then $p \ 2$ else false

else if $p \ 2$ then true else $p \ 0$

Admits a finite model with no repeated queries

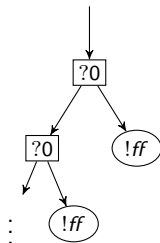


Example predicates and their models IV

Possibly divergent predicate

$$div_0 : (\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}$$
$$div_0 \doteq \mathbf{rec} \, div_0 \, p. \mathbf{if} \, p \, 0 \, \mathbf{then} \, div_0 \, p \, \mathbf{else} \, \mathbf{false}$$

Admits an infinite model with repeated queries



Restriction to n -standard predicates

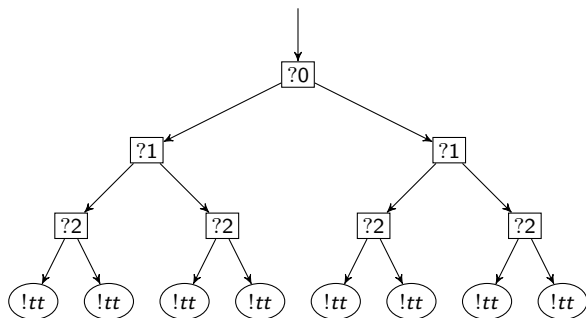
We restrict our analysis to predicates whose models are “ n -standard”; informally

- A perfect binary tree of height $n > 0$, whose interior nodes are queries and leaves are answers.
- Contains every query $?j$ for $j \in \{0, \dots, n - 1\}$.
- No repeated queries along any path in the model.

For example

$$tt_3 \doteq \lambda p.p\ 0; p\ 1; p\ 2; \text{true}$$

is 3-standard because its model is 3-standard



A pure generic search procedure

A possible implementation of generic search in \mathcal{L}

$count_n : ((\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}) \rightarrow \text{Nat}$

$count_n \doteq \lambda pred. count' n (\lambda i. \perp)$

where

$count' 0 \quad p \doteq \mathbf{if\ pred\ } p \mathbf{\ then\ 1\ else\ 0}$

$count' (1 + n) \quad p \doteq \quad count' n (\lambda i. \mathbf{if\ } i = n \mathbf{\ then\ true\ else\ } p\ i)$
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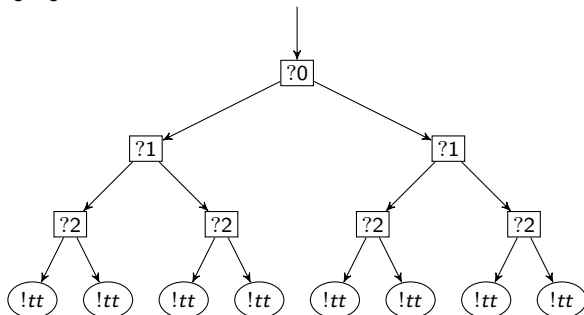
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Example $count_3 tt_3$:



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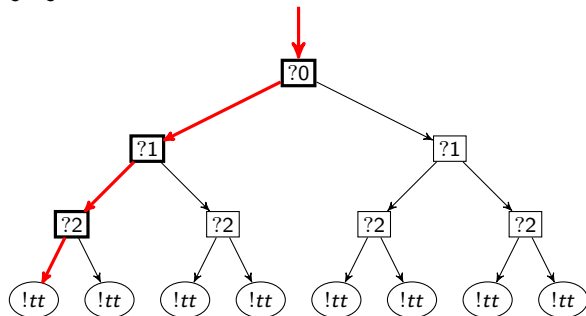
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Example $count_3 \ tt_3$: reaches the first leaf



The effectful generic search procedure

For the efficient implementation of generic search in \mathcal{L}_{eff} , we require one operation; fix $\Sigma \doteq \{\text{Branch} : \langle \rangle \rightarrow \text{Bool}\}$

$\text{count} : ((\text{Nat} \rightarrow \text{Bool}) \rightarrow \text{Bool}) \rightarrow \text{Nat}$

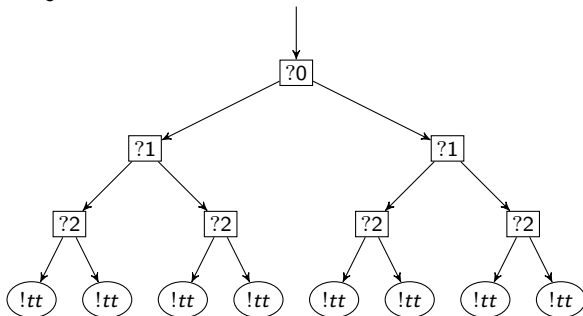
$\text{count} \doteq \lambda \text{pred} . \mathbf{handle} \text{ pred } (\lambda n . \mathbf{do} \text{ Branch}) \mathbf{with}$
 $\mathbf{val} \ x \mapsto \mathbf{if} \ x \ \mathbf{then} \ 1 \ \mathbf{else} \ 0$
 $\text{Branch } \langle \rangle \ r \mapsto r \ \text{true} + r \ \text{false}$

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Example count tt_3 :

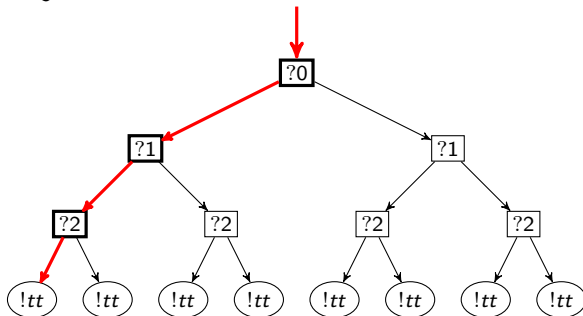


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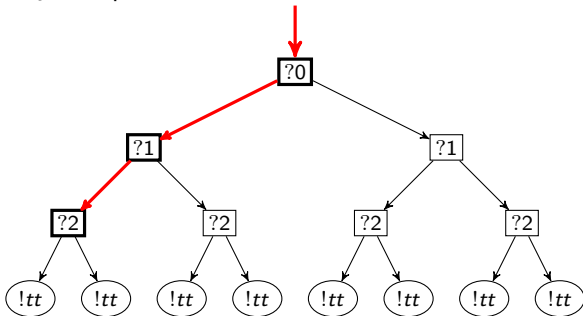


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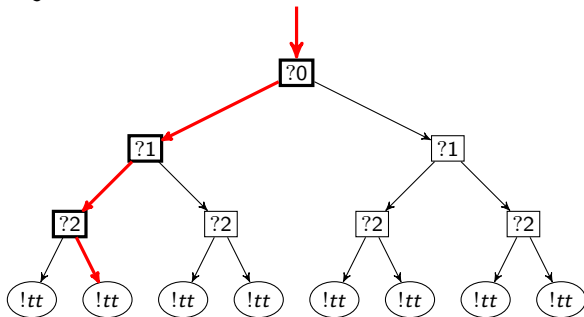


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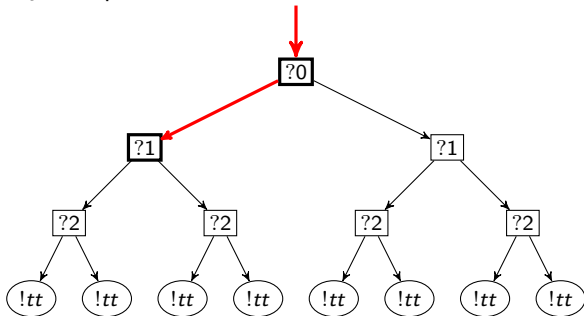


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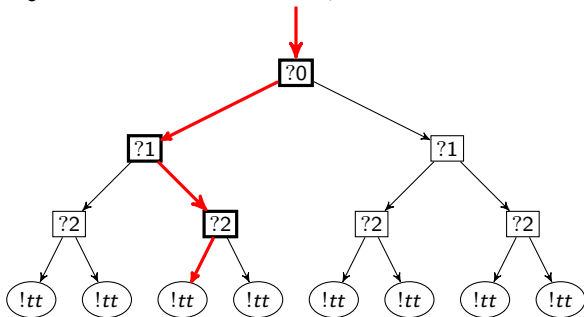


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Example count tt_3 : reaches the third leaf, etc...



Theorem

- 1 For every n -standard predicate $pred$, the generic counting procedure has at most time complexity

$$\text{DTime}(\text{count } pred) = \sum_{bs \in \mathbb{B}^*, |bs| \leq n} \text{steps}(t)(bs) + \mathcal{O}(2^n)$$

- 2 Every generic counting function $\text{count} \in \mathcal{L}$ has for every n -standard predicate $pred$ at least time complexity

$$\text{DTime}(\text{count } pred) = \sum_{bs \in \mathbb{B}^*, |bs| \leq n} 2^{n-|bs|} \text{steps}(t)(bs) + \mathcal{O}(n2^n)$$

Here t denotes the model of $pred$, and $\text{steps}(t)(bs)$ computes the number of reduction steps used to arrive at the query or answer node determined by bs .

Proving the positive result

Define suitable machine configuration computing functions

$$\text{arrive, depart} : \mathbb{B}^* \times \text{Model} \rightarrow \text{Conf}$$

Lemma

Suppose t is a model of a n -standard predicate, then for every boolean list $bs \in \mathbb{B}^$*

$$\text{arrive}(bs, t) \longrightarrow \sum_{|bs| \leq n} \text{steps}(t)(bs) + 2^{n-|bs|} \text{depart}(bs, t)$$

Proof.

Proof by downward induction on the list of booleans bs . □

Proving the negative result

Suppose that we have an arbitrary implementation of generic search $count \in \mathcal{L}$. Pick any n -standard predicate $pred$ and look at the computation arising from $count\ pred$. Now we need to show that

Lemma (Every leaf is visited (A))

The computation ($count\ pred$) visits every leaf in the model of $pred$.

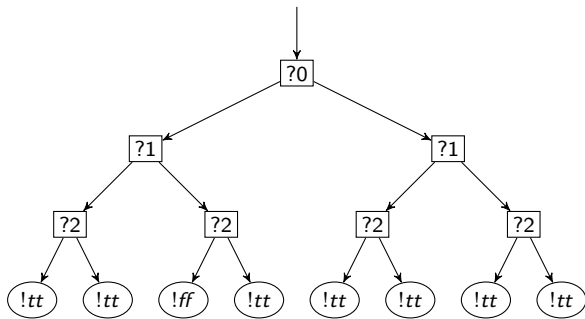
Lemma (No shared computation (B))

If p and p' are distinct points then their subcomputations are disjoint.

Since each subcomputation has length at least $\Omega(n)$ the entire computation must have at least length $\Omega(n2^n)$.

Threads and sections

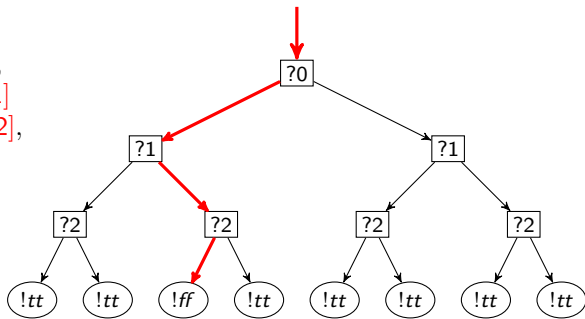
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Thread $\doteq \{$ $\text{pred } p \rightsquigarrow^* \mathcal{E}_0[p\ 0],$
 $\mathcal{E}_0[\text{true}] \rightsquigarrow^* \mathcal{E}_1[p\ 1]$
 $\mathcal{E}_1[\text{false}] \rightsquigarrow^* \mathcal{E}_2[p\ 2],$
 $\mathcal{E}_2[\text{true}] \rightarrow \text{false} \}$

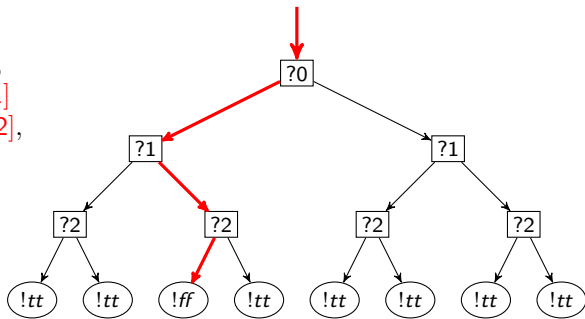


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 $\mathcal{E}_0[true] \rightsquigarrow^* \mathcal{E}_1[p\ 1]$
 $\mathcal{E}_1[false] \rightsquigarrow^* \mathcal{E}_2[p\ 2]$,
 $\mathcal{E}_2[true] \rightarrow false$ }



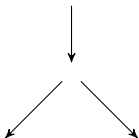
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Proof of Lemma A.

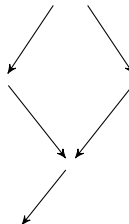
By contradiction: pick a leaf that has no thread; negate the value at the leaf; tweak the predicate accordingly; observe a wrong result. □

No shared computation

Every section has a unique successor



Every section has a single predecessor



Proof.

Follows by definition of section and the semantics being deterministic.

Proof.

By direct calculation on the reduction sequence induced by a section.

Summary and future work

In summary

- We have defined two languages \mathcal{L} and \mathcal{L}_{eff}
- We have demonstrated that \mathcal{L}_{eff} provides strictly more efficient implementations of generic search than \mathcal{L} ($\mathcal{O}(2^n)$ vs $\Omega(n2^n)$)
- ... which establish a new complexity result for control operators
- Intuition: control operators build in support for backtracking.

Future considerations

- Perform empirical experiments to observe the result in practice (Daniels 2016)
- Study the robustness of the result, i.e. what feature(s) can we add to \mathcal{L} whilst retaining an efficiency gap between \mathcal{L} and \mathcal{L}_{eff} ?
- Generalise the result to all conceivable effective models of computations

- Daniels, Robbie (Aug. 2016). “Efficient Generic Searches and Programming Language Expressivity”. MA thesis. Scotland: School of Informatics, the University of Edinburgh.
- Longley, John and Dag Normann (2015). *Higher-Order Computability. Theory and Applications of Computability*. Springer.