

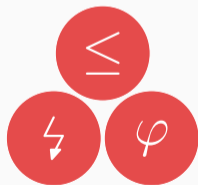
Decalf: A Directed, Effectful Cost-Aware Logical Framework

Harrison Grodin¹ Yue Niu¹ Jonathan Sterling² Robert Harper¹

POPL 2024

¹Carnegie Mellon University

²University of Cambridge



Example (List Map)

$$\text{map} : (A \rightarrow B) \rightarrow \text{list}(A) \rightarrow \text{list}(B)$$
$$\text{map } f \ [] = []$$
$$\text{map } f \ (x :: xs) = f \ x :: \text{map } f \ xs$$

Example (List Map)

$$\text{map} : (A \rightarrow B) \rightarrow \text{list}(A) \rightarrow \text{list}(B)$$
$$\text{map } f \ [] = []$$
$$\text{map } f \ (x :: xs) = f \ x :: \text{map } f \ xs$$

Goal

What is the cost of *map*?


- higher-order function
- argument may perform effects

decalf (embedded in Agda) gives an elegant, linguistic answer.

Core Language

 effects

 program inequality

 phase distinction

Value Types

$A, B, C ::= U(X)$

0 $A + B$

1 $A \times B$

$A \rightarrow B$

nat

list(A)

⋮

Computation Types

$X, Y, Z ::= F(A)$

1 $X \times Y$

$A \rightarrow X$

⋮

Value Types

$A, B, C ::= U(X)$

0 $A + B$

1 $A \times B$

$A \rightarrow B$

nat

list(A)

⋮

Computation Types

$X, Y, Z ::= F(A)$

1 $X \times Y$

$A \rightarrow X$

⋮

These support effects while retaining equational reasoning principles (e.g., β/η equality and pointwise function equality).



Assume some value type \mathbb{C} representing cost monoid (e.g., $(\mathbb{N}, 0, +)$).

Definition (Cost Effect)

$$\frac{\Gamma \vdash c : \mathbb{C} \quad \Gamma \vdash e : X}{\Gamma \vdash \text{step}^c(e) : X}$$

$$\text{step}^0(e) = e$$

$$\text{step}^{c_1}(\text{step}^{c_2}(e)) = \text{step}^{c_1+c_2}(e)$$



Big Idea

To show an exact cost bound, use program equality.



Big Idea

To show an exact cost bound, use program equality.

Definition (Exact Cost in calf)

$$\text{hasCost}_A(e, c) := \sum_{a:A} (e = \text{step}^c(\text{ret}(a)))$$



Big Idea

To show an exact cost bound, use program equality.

Definition (Exact Cost in calf)

$$\text{hasCost}_A(e, c) := \sum_{a:A} (e = \text{step}^c(\text{ret}(a)))$$

Example (Merge Sort)

For all $l : \text{list}(\text{nat})$, we have $\text{hasCost}(\text{msort } l, |l| \log_2 |l|)$.



Inequality [Licata and Harper, 2011, Riehl and Shulman, 2017]

$$e \leq_x e'$$

Intuition

Both e and e' compute the same result, but e may be cheaper.



Inequality [Licata and Harper, 2011, Riehl and Shulman, 2017]

$$e \leq_X e'$$

Intuition

Both e and e' compute the same result, but e may be cheaper.

Example

$$\text{step}^3(\text{ret}(\text{"hi"})) \leq_{F(\text{string})} \text{step}^{12}(\text{ret}(\text{"hi"}))$$



Inequality [Licata and Harper, 2011, Riehl and Shulman, 2017]

$$e \leq_X e'$$

Intuition

Both e and e' compute the same result, but e may be cheaper.

Example

$$\text{step}^3(\text{ret}(\text{"hi"})) \leq_{F(\text{string})} \text{step}^{12}(\text{ret}(\text{"hi"}))$$

Remark

Inequality verifies cost *and* behavior by comparing programs.



$$e \leq_X e'$$

Intuition

Both e and e' compute the same result, but e may be cheaper.

Example

$$\text{step}^3(\text{ret}(\text{"hi"})) \leq_{F(\text{string})} \text{step}^{12}(\text{ret}(\text{"hi"}))$$

Remark

Inequality verifies cost *and* behavior by comparing programs.

Remark

Inspired by *directed type theory*.



Big Idea

To show an inexact cost bound, use program inequality.



Big Idea

To show an inexact cost bound, use program inequality.

Definition (Inexact Cost)

$$\text{isBounded}_A(e, c) := \sum_{a:A} (e \leq \text{step}^c(\text{ret}(a)))$$



Big Idea

To show an inexact cost bound, use program inequality.

Definition (Inexact Cost)

$$\text{isBounded}_A(e, c) := \sum_{a:A} (e \leq \text{step}^c(\text{ret}(a)))$$

Example (Insertion Sort)

For all $l : \text{list}(\text{nat})$, we have $\text{isBounded}(\text{isort } l, |l|^2)$.



Equality vs. Inequality

Equality =

- reflexive
- transitive
- symmetric
- congruence:
 $a = a'$ implies $f(a) = f(a')$
- pointwise on functions

Inequality \leq

- reflexive
- transitive
- N/A
- monotone:
 $a \leq a'$ implies $f(a) \leq f(a')$
- pointwise on functions



Equality vs. Inequality

Equality =

- reflexive
- transitive
- symmetric
- congruence:
 $a = a'$ implies $f(a) = f(a')$
- pointwise on functions

Inequality \leq

- reflexive
- transitive
- N/A
- monotone:
 $a \leq a'$ implies $f(a) \leq f(a')$
- pointwise on functions

Compositional cost analysis via inequality reasoning.



Example (List Insert)

$insert : nat \rightarrow list(nat) \rightarrow F(list(nat))$

$insert\ x\ [] = ret(x :: [])$

$insert\ x\ (y :: ys) =$

$bind\ b \leftarrow step^1(x \leq? y)\ in$

$if\ b\ then\ ret(x :: y :: ys)\ else$

$bind\ ys' \leftarrow insert\ x\ ys\ in\ ret(y :: ys')$



Example (List Insert)

$insert : nat \rightarrow list(nat) \rightarrow F(list(nat))$

$insert\ x\ [] = ret(x :: [])$

$insert\ x\ (y :: ys) =$

$bind\ b \leftarrow step^1(x \leq? y)$ in

 if b then $ret(x :: y :: ys)$ else

$bind\ ys' \leftarrow insert\ x\ ys$ in $ret(y :: ys')$

Theorem (Closed Form Bound)

$$insert \leq \lambda x. \lambda l. step^{||l||} (ret(insert_{spec}\ x\ l))$$



Theorem (Closed Form Bound)

$$insert \leq \lambda x. \lambda l. \text{step}^{|l|}(\text{ret}(insert_{spec} \ x \ l))$$

Proof Excerpt.

begin

step¹(bind $ys' \leftarrow insert \ x \ ys$ in $\text{ret}(x :: ys')$)

$\leq \langle \text{monotonicity, IH} \rangle$

step¹(bind $ys' \leftarrow \text{step}^{|ys|}(\text{ret}(insert_{spec} \ x \ ys))$ in $\text{ret}(x :: ys')$)

$= \langle \rangle$

step^{1+|ys|}($\text{ret}(y :: insert_{spec} \ x \ ys)$)

$= \langle \rangle$

step^{|y::ys|}($\text{ret}(insert_{spec} \ x \ ys)$)



Definition (Extensional Phase)

Proposition ext for isolating behavior. If ext holds:

- $\mathbb{C} \cong \mathbf{1}$
- $a \leq a'$ implies $a = a'$

Modality $\bigcirc A := (\text{ext} \rightarrow A)$ isolates behavioral part of A .

Definition (Extensional Phase)

Proposition ext for isolating behavior. If ext holds:

- $\mathbb{C} \cong \mathbf{1}$
- $a \leq a'$ implies $a = a'$

Modality $\circ A := (\text{ext} \rightarrow A)$ isolates behavioral part of A .

Corollary (Noninterference)

If $\circ A \cong \mathbf{1}$, then every function $A \rightarrow \circ B$ is constant.

Cost does not impact behavior.



Corollary (Cost Removal)

If ext holds, then $\mathbb{C} \cong \mathbf{1}$. So, every $c : \mathbb{C}$ equals 0:

$$\text{step}^c(e) = \text{step}^0(e) = e$$

Corollary (Cost Removal)

If *ext* holds, then $\mathbb{C} \cong \mathbf{1}$. So, every $c : \mathbb{C}$ equals 0:

$$\text{step}^c(e) = \text{step}^0(e) = e$$

Example

If *ext* holds, then *isort* = *msort*.

Effects

decaf supports algebraic effects beyond cost.

Examples:

- errors
- nondeterminism
- probabilistic choice
- global state

Definition (Biased Coin Flip)

$$\frac{\Gamma \vdash p : \mathbb{Q}_{[0,1]} \quad \Gamma \vdash e_0 : X \quad \Gamma \vdash e_1 : X}{\Gamma \vdash \text{flip}_p(e_0, e_1) : X}$$

$$\text{flip}_p(e_0, e_1) = \text{flip}_{1-p}(e_1, e_0)$$

$$\text{flip}_p(e, e) = e$$

⋮

$$\text{step}^c(\text{flip}_p(e_0, e_1)) = \text{flip}_p(\text{step}^c(e_0), \text{step}^c(e_1))$$

Example

Randomized parallel quicksort:

$$qsort : list(nat) \rightarrow F(list(nat))$$

Benign randomization; same value always returned. So:

$$qsort \leq \lambda l. \text{step}^{|l|^2}(\text{ret}(\text{sort}_{\text{spec}} l))$$

Proof by induction.

Example

Randomized parallel quicksort:

$$qsort : list(nat) \rightarrow F(list(nat))$$

Benign randomization; same value always returned. So:

$$qsort \leq \lambda l. \text{step}^{|l|^2}(\text{ret}(sort_{\text{spec}} l))$$

Proof by induction.

Corollary (Correctness)

$$\bigcirc(qsort = \lambda l. \text{ret}(sort_{\text{spec}} l))$$

Example (Random Sublist)

$sublist : list(nat) \rightarrow F(list(nat))$

$sublist [] = ret([])$

$sublist (x :: xs) =$

$bind\ xs' \leftarrow sublist\ xs\ in$

$flip_{\frac{1}{2}}(ret(xs'), step^1(ret(x :: xs')))$

Example (Random Sublist)

```
sublist : list(nat) → F(list(nat))  
sublist [] = ret([])  
sublist (x :: xs) =  
  bind xs' ← sublist xs in  
  flip½(ret(xs'), step1(ret(x :: xs')))
```

Example (Binomial Cost)

```
binomial : nat → F(1)  
binomial zero = ret(★)  
binomial (suc(n)) =  
  flip½(binomial n, step1(binomial n))
```

Definition (Result Erasure)

$$\|-\| : F(A) \rightarrow F(1)$$

$$\|e\| = e ; \text{ret}(\star)$$

Definition (Result Erasure)

$$\|-\| : F(A) \rightarrow F(1)$$

$$\|e\| = e ; \text{ret}(\star)$$

Theorem (Random Sublist Cost)

$$\lambda l. \| \text{sublist } l \| = \lambda l. \text{binomial } |l|$$

Definition (Result Erasure)

$$\|-\| : F(A) \rightarrow F(1)$$

$$\|e\| = e ; \text{ret}(\star)$$

Theorem (Random Sublist Cost)

$$\begin{aligned} \lambda l. \| \text{sublist } l \| &= \lambda l. \text{binomial } |l| \\ &\leq \lambda l. \text{step}^{|l|}(\text{ret}(\star)) \end{aligned}$$

Example (List Map)

$$\text{map} : U(A \rightarrow F(B)) \rightarrow \text{list}(A) \rightarrow F(\text{list}(B))$$
$$\text{map } f \ [] = \text{ret}([])$$
$$\text{map } f \ (x :: xs) =$$
$$\text{bind } ys \leftarrow \text{map } f \ xs \text{ in}$$
$$\text{bind } y \leftarrow f \ x \text{ in}$$
$$\text{ret}(y :: ys)$$

If f can perform arbitrary effects, there's no hope for a succinct, informative bound!

Theorem (Trivial Bound)

Always, $map \leq map$.

Theorem (Trivial Bound)

Always, $\text{map} \leq \text{map}$.

Theorem (Pure Bound)

If $\|f\ x\| \leq \text{step}^c(\text{ret}(\star))$, then

$$\| \text{map } f \ l \| \leq \text{step}^{c|l|}(\text{ret}(\star)).$$

Theorem (Trivial Bound)

Always, $\text{map} \leq \text{map}$.

Theorem (Pure Bound)

If $\|f \ x\| \leq \text{step}^c(\text{ret}(\star))$, then

$$\|\text{map } f \ I\| \leq \text{step}^{c|I|}(\text{ret}(\star)).$$

Theorem (Randomized Bound)

If $\|f \ x\| \leq \text{binomial } n$, then

$$\|\text{map } f \ I\| \leq \text{binomial } (n|I|).$$

Semantics

Definition (Path Relation)

Let $(\mathbb{I}, 0, 1)$ be an interval. Then, the *path relation* $x \sqsubseteq_A y$ is:

$$\exists p: \mathbb{I} \rightarrow A. (p\ 0 = x) \wedge (p\ 1 = y)$$

Definition (Path Relation)

Let $(\mathbb{I}, 0, 1)$ be an interval. Then, the *path relation* $x \sqsubseteq_A y$ is:

$$\exists p: \mathbb{I} \rightarrow A. (p\ 0 = x) \wedge (p\ 1 = y)$$

Goal

- reflexive
- transitive
- monotone: $a \sqsubseteq_A a'$ implies $f(a) \sqsubseteq_B f(a')$
- pointwise on functions
- extensionally discrete: $\bigcirc(x \sqsubseteq_A y)$ implies $\bigcirc(x = y)$

Extensional Discreteness

Require that $\circ\mathbb{I} \cong \mathbf{1}$.

Under ext, any map $\mathbb{I} \rightarrow A$ is constant, so $x \sqsubseteq_A y$ is $x = y$.

Goal

- reflexive
- transitive
- monotone: $a \sqsubseteq_A a'$ implies $f(a) \sqsubseteq_B f(a')$
- pointwise on functions
- extensionally discrete: $\circ(x \sqsubseteq_A y)$ implies $\circ(x = y)$

Extensional Discreteness

Require that $\circ\mathbb{I} \cong \mathbf{1}$.

Under ext, any map $\mathbb{I} \rightarrow A$ is constant, so $x \sqsubseteq_A y$ is $x = y$.

Goal

- reflexive
- transitive
- monotone: $a \sqsubseteq_A a'$ implies $f(a) \sqsubseteq_B f(a')$
- pointwise on functions
- extensionally discrete: $\circ(x \sqsubseteq_A y)$ implies $\circ(x = y)$

Transitivity and Pointwise Ordering

Path relation $x \sqsubseteq_A y$ is not transitive/pointwise on all A . So, isolate a class of A 's (reflective subuniverse) for which it is.

Goal

- reflexive
- transitive
- monotone: $a \sqsubseteq_A a'$ implies $f(a) \sqsubseteq_B f(a')$
- pointwise on functions
- extensionally discrete: $\bigcirc(x \sqsubseteq_A y)$ implies $\bigcirc(x = y)$

Transitivity and Pointwise Ordering

Path relation $x \sqsubseteq_A y$ is not transitive/pointwise on all A . So, isolate a class of A 's (reflective subuniverse) for which it is.

Goal

- ✓ reflexive
- ✓ transitive
- ✓ monotone: $a \sqsubseteq_A a'$ implies $f(a) \sqsubseteq_B f(a')$
- ✓ pointwise on functions
- ✓ extensionally discrete: $\bigcirc(x \sqsubseteq_A y)$ implies $\bigcirc(x = y)$

A Non-Trivial Model

Axioms

1. Interval \mathbb{I} ,
2. discrete type \mathbb{N} ,
3. proposition ext,
4. and $\circ(\mathbb{I} \cong \mathbf{1})$.

Axioms

1. Interval \mathbb{I} ,
2. discrete type \mathbb{N} ,
3. proposition ext ,
4. and $\circ(\mathbb{I} \cong \mathbf{1})$.

Example (Augmented Simplicial Sets)

Simplicial sets, but where initial object $[-1]$ is added to the simplex category.

$$\mathbb{I} := \mathbf{y}[1]$$

$$\text{ext} := \mathbf{y}[-1]$$

Example (Cost Model ω as a QIT)

data ω **where**

zero : ω

suc : $\omega \rightarrow \omega$

$_$: $(n : \omega) \rightarrow n \sqsubseteq_{\omega} \text{suc } n$

Example (Cost Model ω as a QIT)

data ω **where**

zero : ω

suc : $\omega \rightarrow \omega$

$_$: $(n : \omega) \rightarrow n \sqsubseteq_{\omega} \text{suc } n$

Theorem ($\mathbb{C} := \omega$ is a Valid Cost Model)

$$\circ(\omega \cong \mathbf{1})$$

Conclusion

Amortized Analysis [Grodin and Harper, 2023]

Amortized upper bounds (using coinduction)?

Abstraction

Abstract data types and cost signatures? Separating cost from correctness?

Parallelism and Effects

Effects in parallel (commutative)? Non-algebraic effects (e.g., unbounded recursion)?

Advanced Probabilistic Analysis

Expected/with-high-probability cost analysis?




Contribution

calf does synthetic cost analysis at $F(-)$ types. **decalf** adds:

- ⚡ *support for effects and higher-order programs and*
- ≤ *program inequality for inexact bounds*
- ψ *harmonious with extensional reasoning.*


Contribution

calf does synthetic cost analysis at $F(-)$ types. **decalf** adds:


-  *support for effects and higher-order programs and*
-  *program inequality for inexact bounds*
-  *harmonious with extensional reasoning.*

Justification

1. Topos-theoretically via augmented simplicial sets, and
2. practically via full-scale examples embedded in Agda.

-  Danielsson, N. A. (2008).
Lightweight semiformal time complexity analysis for purely functional data structures.

In *Proceedings of the 35th Annual ACM SIGPLAN-SIGACT Symposium on Principles of Programming Languages*, POPL '08, page 133–144, New York, NY, USA. Association for Computing Machinery.

-  Grodin, H. and Harper, R. (2023).
Amortized Analysis via Coinduction.

In Baldan, P. and de Paiva, V., editors, *10th Conference on Algebra and Coalgebra in Computer Science (CALCO 2023)*, volume 270 of *Leibniz International*

Proceedings in Informatics (LIPIcs), pages 23:1–23:6, Dagstuhl, Germany. Schloss Dagstuhl – Leibniz-Zentrum für Informatik.

 Hoare, C. A. R. (1961).



Algorithm 64: Quicksort.




Communications of the ACM, 4(7):321.



 Hoare, C. A. R. (1962).


Quicksort.

The Computer Journal, 5(1):10–16.

-  Hyland, J. M. E. (1991).
First steps in synthetic domain theory.
In Carboni, A., Pedicchio, M. C., and Rosolini, G., editors, *Category Theory*, pages 131–156, Berlin, Heidelberg. Springer Berlin Heidelberg.
-  Levy, P. B. (2003).
Adjunction models for call-by-push-value with stacks.
Electronic Notes in Theoretical Computer Science, 69:248–271.
CTCS'02, Category Theory and Computer Science.

-  Licata, D. R. and Harper, R. (2011).
2-dimensional directed type theory.
Electronic Notes in Theoretical Computer Science, 276:263–289.
Twenty-seventh Conference on the Mathematical Foundations of Programming Semantics (MFPS XXVII).
-  Niu, Y., Sterling, J., Grodin, H., and Harper, R. (2022).
A cost-aware logical framework.
Proceedings of the ACM on Programming Languages, 6(POPL).
-  Phoa, W. (1991).
Domain Theory in Realizability Toposes.
PhD thesis, University of Edinburgh.

-  Plotkin, G. D. and Power, J. (2002).
Notions of computation determine monads.
In *Proceedings of the 5th International Conference on Foundations of Software Science and Computation Structures*, pages 342–356, Berlin, Heidelberg.
Springer-Verlag.
-  Riehl, E. and Shulman, M. (2017).
A type theory for synthetic ∞ -categories.
Higher Structures, 1:147–224.

-  Sterling, J. (2021).
First Steps in Synthetic Tait Computability: The Objective Metatheory of Cubical Type Theory.
PhD thesis, Carnegie Mellon University.
Version 1.1, revised May 2022.
-  Sterling, J. and Harper, R. (2021).
Logical relations as types: Proof-relevant parametricity for program modules.
Journal of the ACM, 68(6).