

# **Cost-sensitive computational adequacy of higher-order recursion in synthetic domain theory**

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# Introduction

The story begins with a type theory **calF** developed to unify *cost-sensitive* and *functional* verification [Niu+22].

- **Functional:** IO-behavior of programs, data structure invariants
- **Cost-sensitive:** computational cost or resource usage (time, space, *etc.*)

Functional properties are about *if* a program is correct, cost-sensitive properties are about *how much* resource a program uses.

# Introduction

**calF** supports a *denotational* style of cost analysis — connection to operational semantics via a **cost-sensitive computational adequacy** property à la Plotkin [Plo77].

Prior work: cost-sensitive adequacy for first-order recursion [NH23].

This talk: cost-sensitive adequacy for **PCF** (*higher-order* recursion).

# Outline

## Introduction to **calf**:

- Cost-sensitive and functional reasoning in **calf**
- Cost-sensitive adequacy property

## Integrating higher-order recursion in **calf**:

- Introduction to *synthetic domain theory* (SDT)
- Cost-sensitive SDT
- Cost-sensitive adequacy in SDT

# Cost as an abstract effect

In **calF**, cost is an *abstract effect*  $F(A)$  supporting an operation  $\text{step} : \mathbb{C} \rightarrow F(1)$ . Think of  $\text{step}^c$  as taking  $c$  abstract steps:

$\text{insertSort} : \text{list} \rightarrow F(\text{list})$

$\text{insertSort}(l) = \dots \text{step}^c; e \dots$

Under the hood define  $F(A) = \mathbb{C} \times A$  and  $\text{step}^c = (c, \star)$ . Can reason about  $\text{step}$ 's equationally:

$\text{step}^{c_1}; \text{step}_2^{c_2} = \text{step}^{c_1+c_2}$

$\text{step}^0; e = e$

# Functional reasoning in calf

How to reason about the purely *functional* properties of cost-sensitive programs?

$$\text{isSorted}(\text{insertSort}(l)) \iff \text{isSorted}(\text{mergeSort}(l))$$

Should be automatic because both are sorting algorithms. But *not* because  $\text{insertSort} \neq \text{mergeSort}$  due to presence of cost structure!

# Cost as a phase

The functional semantics of (total) programs is naturally modeled in **Set**.

**Set** is too “flat”: the cost effect  $\mathbb{C} \times - : \mathbf{Set} \rightarrow \mathbf{Set}$  does not distinguish data from cost structure.

**calf**: cost as a new **dimension** or **phase**.



# Cost structure as families

**calF** = the internal type theory of the category of *families*  $\mathbf{Set}^{\rightarrow}$

A type in  $\mathbf{Set}^{\rightarrow}$  is a cost-sensitive set equipped with a restriction action to the purely functional component:

$$\begin{array}{ccc} A^{\bullet} & & \text{“cost-sensitive”} \\ \downarrow \pi_A & & \\ A^{\circ} & & \text{“functional”} \end{array}$$

Think Kripke/possible worlds semantics over  $\mathbb{I} = \{\circ \rightarrow \bullet\}$ .

# Functional vs. cost-sensitive phase

Presheaves over  $\{\circ \rightarrow \bullet\}$  exhibits a **phase distinction**:

- World at  $\circ$  = **functional phase**
- World at  $\bullet$  = **cost-sensitive phase**
- In cost-sensitive phase,  $\text{insertSort} \neq \text{mergeSort}$ .
- In functional phase,  $\text{insertSort} = \text{mergeSort}$ .

Presheaf restriction  $\bullet \rightarrow \circ$  trivializes/redacts cost structure!

# Modal types

A *modal type* is either purely functional or purely cost-sensitive.

## *Definition*

A type is *purely functional* or *function-modal* when it is in the image of the constant presheaves functor  $\mathbf{Set} \rightarrow \mathbf{Set}^{\rightarrow}$ .

## *Definition*

A type is *purely cost-sensitive* or *cost-modal* when it is given by a terminal map  $A \rightarrow 1$ .

# Cost effect with cost-modal types

Define  $F(A)$  by using a *cost-modal* monoid object  $\mathbb{C}$ :

$$F\left(\begin{array}{c} A^\bullet \\ \downarrow \\ A^\circ \end{array}\right) = \begin{array}{c} \mathbb{N} \\ \downarrow \\ \mathbf{1} \end{array} \times \begin{array}{c} A^\bullet \\ \downarrow \\ A^\circ \end{array} = \begin{array}{c} \mathbb{N} \times A^\bullet \\ \downarrow \\ A^\circ \end{array}$$

Restriction deletes cost structure.

# Internalization

Modal types can be phrased in the internal language of  $\mathbf{Set}^{\rightarrow}$ .

Let  $\Downarrow : \Omega$  be the *intermediate* proposition in  $\mathbf{Set}^{\rightarrow}$ :

$$\perp = \begin{array}{c} \circ \\ \downarrow \\ \circ \end{array}$$

$$\Downarrow = \begin{array}{c} \circ \\ \downarrow \\ \mathbf{1} \end{array}$$

$$\top = \begin{array}{c} \mathbf{1} \\ \downarrow \\ \mathbf{1} \end{array}$$

Assuming  $\Downarrow =$  restricting to the functional phase of **calf**.

# Internal characterization of modal types

## *Proposition*

*A type  $A$  is function-modal when  $(\ulcorner \rightarrow A) \cong A$ .*

## *Proposition*

*A type  $A$  is cost-modal when  $(\ulcorner \rightarrow A) \cong 1$ .*

In other words, a function-modal type “thinks” the functional phase holds and a cost-modal type “thinks” the functional phase is false.

# Constructing modal types

Given  $A$ ,  $\mathbb{1} \rightarrow A$  is function-modal. Dually, construct a cost-modal type  $\mathbb{1} \vee A$  as follows:

$$\begin{array}{ccc}
 A \times \mathbb{1} & \xrightarrow{\pi_2} & \mathbb{1} \\
 \pi_1 \downarrow & & \downarrow * \\
 A & \xrightarrow{\eta} & \mathbb{1} \vee A
 \end{array}$$

The *cost modality*  $\mathbb{1} \vee -$  quotients the type  $A$  to a unique point  $*$  in the functional phase.

# Functional and cost reasoning, internally

Semantically,  $F(A) = (\mathbb{N} \vee \mathbb{C}) \times A$ .

Thus *insertSort*  $\neq$  *mergeSort* since the cost monoid  $\mathbb{N} \vee \mathbb{C}$  is nontrivial.

But,  $\mathbb{N} \rightarrow ((\mathbb{N} \vee \mathbb{C}) \cong 1)$ , so *insertSort* = *mergeSort* in the functional phase!



# calf vs. programming languages

Cost analysis in **calf** is *equational* or *denotational*  
( $\text{step}^{c_1}; \text{step}^{c_2} = \text{step}^{c_1+c_2}$ ).

Problems:

- How to relate cost analysis in **calf** to PLs with *operational* cost semantics?
- How to reconcile general recursive functions in PLs with total functions in **calf**?

# calf vs. programming languages

Solution:

- Enrich **calf** with *partiality* via *synthetic domain theory*.
- Relate PLs and **calf** by an *internal, cost-sensitive* computational adequacy property.

Upshot:

- General recursive programming in **calf**
- Cost-sensitive generalization of Plotkin's classic adequacy property.

# Cost-sensitive computational adequacy

Example: take STLC equipped with the cost effect  $F(A)$ . Internal to **calf**, we have a language  $\mathcal{L} = (\text{Ty} : \mathcal{U}, \text{Tm} : \text{Ty} \rightarrow \mathcal{U})$ .

*Internal denotational cost semantics of  $\mathcal{L}$ :*

- $\llbracket - \rrbracket_{\text{Ty}} : \text{Ty} \rightarrow \mathcal{U}$
- $(\llbracket - \rrbracket_{\text{Tm}})_A : \text{Tm}(A) \rightarrow \llbracket A \rrbracket_{\text{Ty}}$

As before  $\llbracket F(A) \rrbracket = \mathbb{C} \times \llbracket A \rrbracket$ .

*Internal operational cost semantics of  $\mathcal{L}$ :*

- $\Downarrow_A \subseteq \text{Tm}(A) \times \mathbb{C} \times \text{Tm}(A)$

# Cost-sensitive computational adequacy

## Definition

A language satisfies **cost-sensitive computational adequacy** when for all  $e : F(\mathcal{Z})$ ,  $\llbracket e \rrbracket =_{\mathbb{C} \times \llbracket A \rrbracket} (c, \llbracket v \rrbracket)$  if and only if  $e \Downarrow^c v$ .

Classic Plotkin adequacy:  $\llbracket - \rrbracket$  carves out functions that are definable operationally.

Cost-sensitive adequacy:  $\llbracket - \rrbracket$  carves out **calf** functions that are definable operationally *in a cost-reflecting way*.

# Cost-sensitive adequacy for higher-order recursion

Prior work:  $\mathcal{L}$  = Algol-like languages with while loops [NH23].

This work:  $\mathcal{L}$  = **PCF**.

# Recursion in type theory

To define the denotational cost semantics of **PCF** in **cal $f$** , we need a notion of *partial* functions in type theory.

Attempt: model **cal $f$**  in presheaves valued in  $\omega\mathbf{CPO}^{\rightarrow}$ .

Unfortunately not a model of dependent type theory.

# Synthetic domain theory

Integrate higher-order recursion into type theory by means of *synthetic domain theory* (SDT):

- Intuitionistic type theory
- Class of *predomains*
- *All* definable predomain maps automatically continuous

Concretely: a topos  $\mathcal{E}$  equipped with a full subcategory  $\text{Predom}$ .

# Axioms of SDT

To start, we need an object called the *dominance* that serves as the classifier of the *support* of partial maps.

## *Definition*

A *dominance* subobject  $\Sigma \hookrightarrow \Omega$  that is closed under  $\top : \Omega$  and dependent sums.

Frequently  $\Sigma$  is also required to be closed under  $\perp : \Omega$ .



# Lifting structure

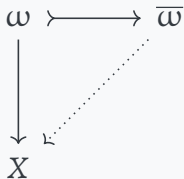
The dominance  $\Sigma$  induces a *lifting structure*  $L(A) = \Sigma_{\phi:\Sigma} \cdot \phi \rightarrow A$ :  
partial maps  $A \xleftrightarrow{\Sigma} D \rightarrow B$  as total maps  $A \rightarrow L(B)$ .

Lifting induces an incidence relation  $\omega \hookrightarrow \bar{\omega}$  including the  
initial lift algebra  $\omega$  into the final lift coalgebra  $\bar{\omega}$ .

Think of  $\omega \hookrightarrow \bar{\omega}$  as a *figure shape* that we use to state the  
completeness properties of predomains.

# Predomains in SDT

A *predomain* has the unique extension property along  $\omega \hookrightarrow \bar{\omega}$ :



Synthetic counterpart to  $\omega\text{cpos}$ , which extend along the figure shape  $\{0 \leq 1 \leq \dots\} \hookrightarrow \{0 \leq 1 \leq \dots \leq \infty\}$ .

# Model of SDT

A *model of SDT* is given by a topos  $\mathcal{E}$  equipped with a predomain dominance  $\Sigma$ .

Every such model induces a full subcategory of predomains that is a *reflective exponential ideal*:

- Closed under limits and exponentials: types of **PCF**
- All colimits exist: used to define the cost-modal type  $\mathbb{P} \vee \mathbb{C}$
- Every endomap of domains (predomains with lift algebras) has a fixed-point: fix operator

# Denotational semantics of PCF in cost-sensitive SDT

To interpret **PCF** with the cost effect  $F(A)$ , need a proposition  $\phi$  for the *functional phase*:

## *Definition*

A *model of SDT with a phase distinction* is a model of SDT  $(\mathcal{E}, \Sigma, \phi)$  where  $\phi$  is a  $\Sigma$ -proposition.

Semantically:  $\llbracket F(A) \rrbracket = \mathbf{L}(\mathbf{C} \times \llbracket A \rrbracket)$  with  $\mathbf{C}$  cost-modal.

Need  $\phi : \Sigma$  to ensure  $\phi \vee A$  is a predomain when  $A$  is one.

# Operational semantics of PCF

Our proof of computational adequacy relies on the fact that  $e \Downarrow^c v$  is a  $\Sigma$ -proposition.

Define the operational semantics as a partial function  $\text{eval} : \text{Tm}(F(A)) \rightarrow \text{Tm}(F(A)) \rightarrow L(\mathbb{C})$ :

$$\text{eval}(e, v) = \begin{cases} c \boxplus \text{eval}(e', v) & \text{out}(e) = \text{inr} \cdot (c, e') \\ (e = v, \lambda u. \circ) & \text{out}(e) = \text{inl} \cdot \star \end{cases}$$

In the above, we write  $\text{out} : \text{Tm}(A) \rightarrow 1 + (\mathbb{C} \times \text{Tm}(A))$  for the one step transition relation, and  $- \boxplus -$  for the cost algebra map.

# Logical relation for computational adequacy

Define a family of relations  $\triangleleft_A \subseteq \llbracket A \rrbracket \times \text{Tm}(A)$  between the syntax and semantics of **PCF**.

A technical point is the definition of  $\triangleleft_{F(A)}$ :

$$e (R \Rightarrow S) e' = \forall [a R a'] (e a) S (e' a')$$

$$e \triangleleft_{FA} e' = \forall [f (\triangleleft_A \Rightarrow \leq) f'] e; f \leq e'; f'$$

In the above we write  $e \leq e'$  for the *specialization order* or *definedness order* on  $F(\mathbf{1}) \cong L(\mathbf{C})$ .

Ensures that  $(- \triangleleft_{F(A)} e') \subseteq \llbracket F(A) \rrbracket$  is always a sub-predomain or *admissible*.

# Fundamental lemma and computational adequacy

We may prove the fundamental lemma of the logical relation:

## *Theorem*

Given  $\Gamma \vdash e : A$ , we have  $\Gamma \vdash \llbracket e \rrbracket \triangleleft_A e$ .

Cost-sensitive computational adequacy follows directly from the fundamental lemma:

## *Theorem*

Given  $e : F(1)$ , we have that  $\llbracket e \rrbracket = \text{eval}(e, \star)$ .

# Model of cost-sensitive SDT

To incorporate cost structure as a phase distinction, define a model of SDT fibred over  $\mathbf{Set}^{\rightarrow}$ .

Isolate a (small) category  $\mathcal{C}$  of *internal dcpos* in  $\mathbf{Set}^{\rightarrow}$ .

- Presheaves on  $\mathcal{C}$  is *almost* a model of SDT.
- Restrict to sheaves on  $\mathcal{C}$  for the extensive coverage: preserves  $\emptyset$  and  $+$ .

## *Theorem*

*The category of (internal) sheaves on  $\mathcal{C}$  furnishes a model of SDT such that the functional phase proposition  $\P : \mathcal{C}$  is preserved by the Yoneda embedding.*



# Related work

- Computational adequacy in SDT [Sim99; Sim04]
- Relative sheaf models of SDT [SH22]
- Rooted in the type-theoretic framework **calF**
- Extended the results of Niu and Harper [NH23] to **PCF**
- Denotational cost semantics based on prior work on effectful **PCF** [Kav+19]

# Conclusion

- Integrated higher-order recursion into **cal**f type theory
- Internal cost-sensitive computational adequacy theorem for **PCF**
- Connecting denotational and operational reasoning for cost analysis in type theory
- Relative sheaf model of the function-cost phase distinction

# Future work

- Recursive types [Sim04]
- Relating internal and *external* cost-sensitive adequacy

Thanks for listening!

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