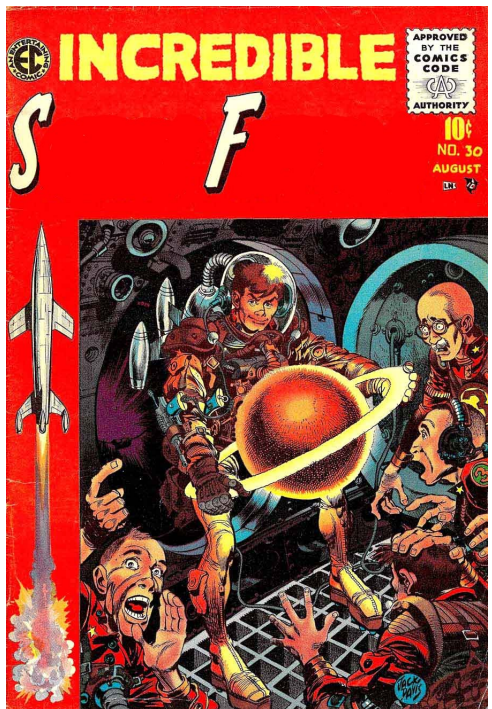


Control Flow Analysis for SF Combinator Calculus

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Verification and Program
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Motivation

- ▶ Programs that transform other programs are a form of **metaprogramming**.
- ▶ In most languages, program code is not a first-class citizen.
 - ▶ This makes formal reasoning about the behaviour of program-transforming programs difficult.
- ▶ Recent work on analysis of metaprogramming focuses mainly on **extensional** operations, such as composition of well-formed code templates.
 - ▶ Many program transformations are **intensional**: they decompose code.
- ▶ **SF Combinator Calculus** succinctly expresses intensional operations.
 - ▶ Let's try to analyse that too.
- ▶ **OCFA** is a well-understood and widely-used program analysis.
 - ▶ Let's try to formulate it for SF Combinator Calculus.

Outline

Motivation

Outline

Background

- SK Combinator Calculus

- SF Combinator Calculus

- OCFA for λ -calculus

OCFA for SK-calculus

OCFA for SF-calculus

Conclusion

SK Combinator Calculus — Review

SF Combinator Calculus is similar to **SK** Combinator Calculus, so let us first review that.

SK Combinator Calculus is a Turing-powerful model of computation [HS08].

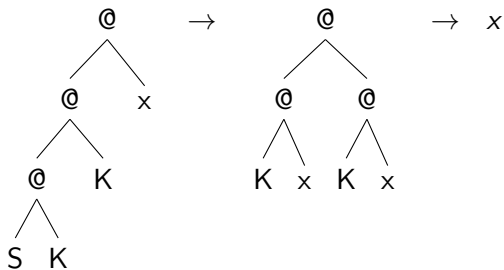
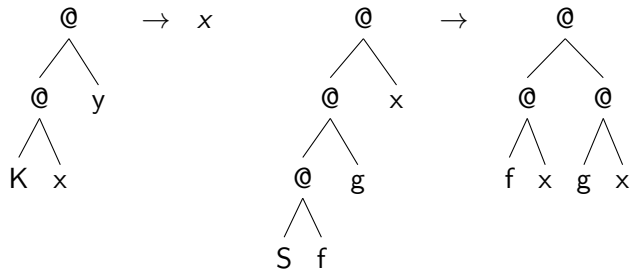
Consider terms:

- ▶ built from two **combinators** S and K ...
 - ▶ ... each with an associated rewrite rule:
 - ▶ $S f g x \rightarrow f x (g x)$
 - ▶ $K x y \rightarrow x$
- ▶ using **application**;
- ▶ viewed as trees.

Then:

- ▶ a term is a function or a program;
- ▶ a sequence of rewrites is execution of a program.

SK Combinator Calculus — Terms as Trees



SK Combinator Calculus — and λ -Calculus

How does SK-calculus relate to λ -calculus?

- ▶ S and K can be translated into λ -calculus by *lambda*:
 - ▶ $lambda(S) \equiv \lambda f.\lambda g.\lambda x.f\ x\ (g\ x)$
 - ▶ $lambda(K) \equiv \lambda x.\lambda y.x$
- ▶ Any closed term e of λ -calculus can be written as a purely applicative term t built from S and K using a translation *unlambda*.
 - ▶ *unlambda* is left-inverse to *lambda*:

$$t \xrightarrow{lambda} e \xrightarrow{unlambda} t$$

- ▶ But in general:

$$e \xrightarrow{unlambda} t \not\xrightarrow{lambda} e$$

- ▶ The relationship is preserved by reduction:

$$\begin{array}{ccc} t & \xrightarrow{reduce} & t' \\ lambda \downarrow & & \uparrow unlambda \\ e & \xrightarrow{reduce^+} & e' \end{array}$$

SK Combinator Calculus — Advantages and Disadvantages

Advantages:

- ▶ no need to reason about **bound variables**;
- ▶ all transformations are **local**;
- ▶ practical as an “assembly language” for functional programs.

Disadvantages:

- ▶ hard for humans to read.
- ▶ can be larger than equivalent λ -terms (unless extended combinator set is used).

SF Combinator Calculus — Reductions

S behaves the same as in SK-calculus.

F allows **factorisation** of its first argument.

$$\begin{aligned} F f x y &\rightarrow x && \text{if } f = S \text{ or } f = F \\ F (u v) x y &\rightarrow y u v && \text{if } u v \text{ is a factorable form} \end{aligned}$$

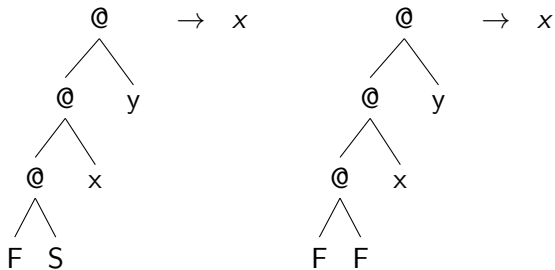
A **factorable form** is a term of form S , $S u$, $S u v$, F , $F u$ or $F u v$.

Properties:

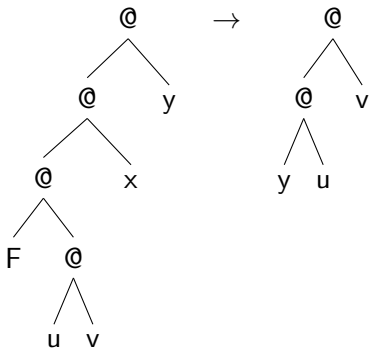
- ▶ By encoding K as $F F$, we get all the power of SK-calculus.
- ▶ We can check for equality of terms in normal form.
- ▶ We can distinguish between two terms that compute the same function in a different way.
- ▶ The restriction to factorable forms ensures **confluence**, hence a consistent equational theory [GJ11].
- ▶ Adding types in the style of System F, we can type a self-interpreter for SF-calculus [JP11].

Claim: **SF-calculus is a good formalism for writing program-transforming programs.**

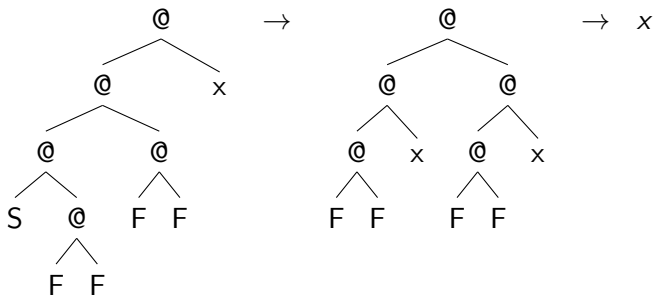
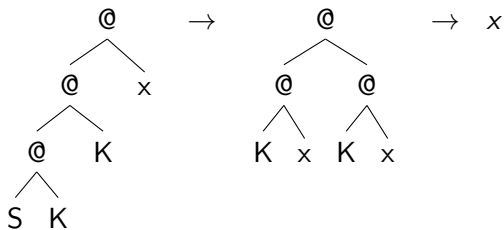
SF Combinator Calculus — Terms as Trees



SF Combinator Calculus — Terms as Trees



SF Combinator Calculus — Terms as Trees



OCFA for λ -calculus — Overview

OCFA is a **Control Flow Analysis** [Mid12]:

- ▶ For each variable x in a program, it tell us **what functions can be bound to x** .
- ▶ This is important in functional programs, where functions determine control flow.
- ▶ Numerous applications, including compiler optimisations and as the foundation for other analysis, such as abstract interpretation frameworks.

Properties of OCFA:

- ▶ **Practical time complexity:** $\mathcal{O}(n^3)$ or better.
- ▶ Necessarily some **imprecision**; this arises when the same function is called from two different places.

More advanced analyses:

- ▶ k -CFA adds k levels of calling context.
 - ▶ When $k = 0$, this is OCFA.
 - ▶ For $k \geq 1$, precision improves, but EXPTIME-complete.
- ▶ CFA2 uses a pushdown abstraction.
 - ▶ Often faster and more precise than k -CFA.

OCFA for λ -calculus — Analysis Rules

Give each subexpression a distinct **label** l .

Generate and solve set **constraints** over Γ .

Labels	$Label \ni l$
Variables	$Var \ni x$
Labelled Expressions	$e ::= x^l \mid e_1 @^l e_2 \mid \lambda^l x. e$
Abstract Values	$Abs \ni v ::= FUN(x, l)$
Abstract Environment	$\Gamma : Label \uplus Var \rightarrow \mathcal{P}(Abs)$

$$\begin{aligned}\Gamma \models x^l &\iff \Gamma(x) \subseteq \Gamma(l) \\ \Gamma \models \lambda^{l_1} x. e^{l_2} &\iff \Gamma \models e^{l_2} \wedge FUN(x, l_2) \in \Gamma(l_1) \\ \Gamma \models e_1^{l_1} @^l e_2^{l_2} &\iff \Gamma \models e_1^{l_1} \wedge \Gamma \models e_2^{l_2} \wedge \\ &(\forall FUN(x, l_3) \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(x) \wedge \Gamma(l_3) \subseteq \Gamma(l))\end{aligned}$$

- ▶ $FUN(x, l_2)$ — any function that binds x with body labelled l_2
- ▶ $FUN(x, l_2) \in \Gamma(l_1)$ — such a function could occur at l_1
- ▶ $\Gamma(l_3) \subseteq \Gamma(l)$ — anything that occurs at l_3 could occur at l

OCFA for SK-calculus

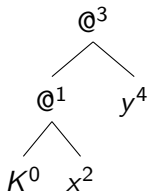
To work out how to do OCFA for SF-calculus, let us first look at SK-calculus.

- ▶ OCFA tracks which functions can be bound to which variables.
- ▶ How do we do that with **no variables**?
- ▶ Easy: Just use the *lambda* translation.
- ▶ But that won't help us with SF-calculus.
- ▶ So reformulate the constraints to get rid of variable binding.
- ▶ Give each combinator and application a distinct label n or l .
- ▶ Key idea: **Abstract values indicate a node's local left children in weak normal form.**
 - ▶ $S_0^n \in \Gamma(l)$ — S^n may occur at the node labelled l
 - ▶ $S_1^n \in \Gamma(l)$ — S^n may occur at l 's left child
 - ▶ $S_2^n \in \Gamma(l)$ — S^n may occur at l 's left child's left child
 - ▶ S_3^n — not needed, as it can never occur in normal form
 - ▶ $\varphi(n)$ — if true, S^n might be reduced

OCFA for SK-calculus — Analysis Rules

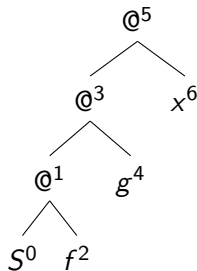
Base Labels	n
Sublabel Names	$s ::= S.0 \mid S.1 \mid S.2 \mid S.3 \mid S.L \mid S.R \mid K.0$
Labels	$Label \ni l ::= n \mid n.s$
Labelled Terms	$t ::= S^n \mid K^n \mid t_1 @^l t_2 \mid \langle x \rangle^l$
Abstract Values	$Abs \ni v ::= S_0^n \mid S_1^n \mid S_2^n \mid K_0^n \mid K_1^n$
Abstract Environment	$\Gamma : Label \rightarrow \mathcal{P}(Abs)$
Abstract Activation	$\varphi : Label \rightarrow Bool$
$\Gamma, \varphi \models S^n$	$\iff S_0^n \in \Gamma(n) \wedge (\varphi(n) \Rightarrow \Gamma, \varphi \models t_{S^n})$
$\Gamma, \varphi \models K^n$	$\iff K_0^n \in \Gamma(n)$
$\Gamma, \varphi \models t_1^{l_1} @^{l_3} t_2^{l_2}$	$\iff \Gamma, \varphi \models t_1 \wedge \Gamma, \varphi \models t_2$ $\wedge \forall S_0^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.S.0) \wedge S_1^n \in \Gamma(l_3)$ $\wedge \forall S_1^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.S.1) \wedge S_2^n \in \Gamma(l_3)$ $\wedge \forall S_2^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.S.2) \wedge \Gamma(n.S.3) \subseteq \Gamma(l_3) \wedge \varphi(n)$ $\wedge \forall K_0^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.K.0) \wedge K_1^n \in \Gamma(l_3)$ $\wedge \forall K_1^n \in \Gamma(l_1). \Gamma(n.K.0) \subseteq \Gamma(l_3)$
$\Gamma, \varphi \models \langle x \rangle^l$	$\iff true$
$t_{S^n} \stackrel{def}{=} (\langle f \rangle^{n.S.0} @^{n.S.L} \langle x \rangle^{n.S.2}) @^{n.S.3} (\langle g \rangle^{n.S.1} @^{n.S.R} \langle x \rangle^{n.S.2})$	

OCFA for SK-calculus — Analysis Rules



At K^0 : $K_0^0 \in \Gamma(0)$
 \Downarrow
At $@^1$: $K_1^0 \in \Gamma(1)$ $\Gamma(2) \subseteq \Gamma(0.K.0)$
 \Downarrow
At $@^3$: $\Gamma(0.K.0) \subseteq \Gamma(3)$
 \Downarrow
So: $\Gamma(2) \subseteq \Gamma(0.K.0) \subseteq \Gamma(3)$

OCFA for SK-calculus — Analysis Rules



At S^0 : $S_0^0 \in \Gamma(0)$

\Downarrow

At $@^1$: $S_1^0 \in \Gamma(1)$ $\Gamma(2) \subseteq \Gamma(0.S.0)$

\Downarrow

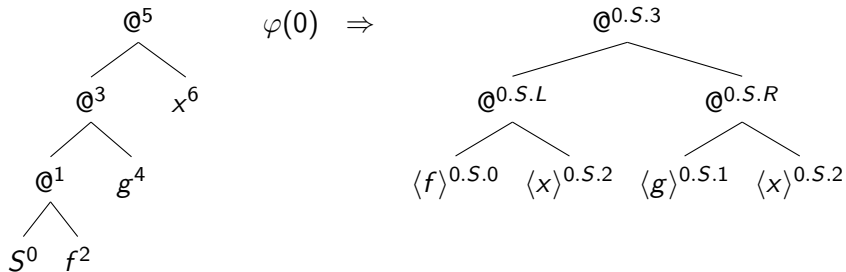
At $@^3$: $S_2^0 \in \Gamma(3)$ $\Gamma(4) \subseteq \Gamma(0.S.1)$

\Downarrow

At $@^5$: $\varphi(0)$ $\Gamma(6) \subseteq \Gamma(0.S.2)$ $\Gamma(0.S.3) \subseteq \Gamma(5)$

\Downarrow

OCFA for SK-calculus — Analysis Rules



Suppose $f = K$:

$$K_0^2 \in \Gamma(2)$$

$$\Downarrow$$

$$K_0^2 \in \Gamma(0.S.0)$$

$$\Downarrow$$

$$\Gamma(0.S.2) \subseteq \Gamma(0.S.3)$$

$$\text{So : } \Gamma(6) \subseteq \Gamma(0.S.2) \subseteq \Gamma(0.S.3) \subseteq \Gamma(5)$$

OCFA for SF-calculus — Challenges

S behaves the same in SK-calculus and SF-calculus, so use the same rules.

How can we handle F ? There are two challenges:

- ▶ How do we determine **which reduction** is used?
 - ▶ Abstract values already record **how many arguments** a combinator has.
 - ▶ Atoms have 0 arguments — abstractly S_0^n and F_0^n .
 - ▶ Compounds have ≥ 1 argument — $S_1^n, S_2^n, F_1^n, F_2^n$.
- ▶ How do we **factorise abstractly**?
 - ▶ Add new abstract values that record the source of an application.
 - ▶ $@^{l_1, l_2} \in \Gamma(l_3)$ — the subtree at l_3 might have been built by applying the subtree at l_1 to the subtree at l_2 .

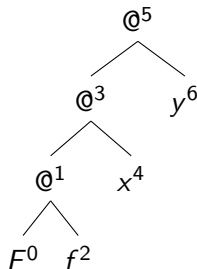
OCFA for SF-calculus — Analysis Rules

Base Labels	n
Sublabel Names	$s ::= S.0 \mid S.1 \mid S.2 \mid S.3 \mid S.L \mid S.R \mid F.0 \mid F.1 \mid F.2 \mid F.3 \mid F.L \mid F.R \mid F.M$
Labels	$Label \ni l ::= n \mid n.s$
Labelled Terms	$t ::= S^n \mid F^n \mid t_1 @^l t_2 \mid \langle x \rangle^l$
Abstract Values	$Abs \ni v ::= S_0^n \mid S_1^n \mid S_2^n \mid F_0^n \mid F_1^n \mid F_2^n \mid @^{(h_1, h_2)}$
Abstract Environment	$\Gamma : Label \rightarrow \mathcal{P}(Abs)$
Abstract Activation	$\varphi : Label \rightarrow Bool$
$\Gamma, \varphi \models S^n$	$\iff S_0^n \in \Gamma(n) \wedge (\varphi(n) \Rightarrow \Gamma, \varphi \models t_{S^n})$
$\Gamma, \varphi \models F^n$	$\iff F_0^n \in \Gamma(n)$ $\wedge \varphi(n) \Rightarrow (\exists n_0. S_0^{n_0} \in \Gamma(n.F.0) \vee F_0^{n_0} \in \Gamma(n.F.0)) \Rightarrow \Gamma(n.F.1) \subseteq \Gamma(n.F.3)$ $\wedge \varphi(n) \Rightarrow (\exists n_0. S_1^{n_0} \in \Gamma(n.F.0) \vee S_2^{n_0} \in \Gamma(n.F.0) \vee F_1^{n_0} \in \Gamma(n.F.0) \vee F_2^{n_0} \in \Gamma(n.F.0)) \Rightarrow \Gamma, \varphi \models t_{F^n} \wedge \forall @^{h_1, h_2} \in \Gamma(n.F.0). \Gamma(h_1) \subseteq \Gamma(n.F.L) \wedge \Gamma(h_2) \subseteq \Gamma(n.F.R)$
$\Gamma, \varphi \models t_1^h @^l t_2^{h_2}$	$\iff \Gamma, \varphi \models t_1 \wedge \Gamma, \varphi \models t_2$ $\wedge \exists @^{h_4, h_5} \in \Gamma(l_3). \Gamma(h_1) \subseteq \Gamma(h_4) \wedge \Gamma(h_2) \subseteq \Gamma(h_5)$ $\wedge \forall S_0^n \in \Gamma(h_1). \Gamma(h_2) \subseteq \Gamma(n.S.0) \wedge S_1^n \in \Gamma(l_3)$ $\wedge \forall S_1^n \in \Gamma(h_1). \Gamma(h_2) \subseteq \Gamma(n.S.1) \wedge S_2^n \in \Gamma(l_3)$ $\wedge \forall S_2^n \in \Gamma(h_1). \Gamma(h_2) \subseteq \Gamma(n.S.2) \wedge \Gamma(n.S.3) \subseteq \Gamma(l_3) \wedge \varphi(n)$ $\wedge \forall F_0^n \in \Gamma(h_1). \Gamma(h_2) \subseteq \Gamma(n.F.0) \wedge F_1^n \in \Gamma(l_3)$ $\wedge \forall F_1^n \in \Gamma(h_1). \Gamma(h_2) \subseteq \Gamma(n.F.1) \wedge F_2^n \in \Gamma(l_3)$ $\wedge \forall F_2^n \in \Gamma(h_1). \Gamma(h_2) \subseteq \Gamma(n.F.2) \wedge \Gamma(n.F.3) \subseteq \Gamma(l_3) \wedge \varphi(n)$
$\Gamma, \varphi \models \langle x \rangle^l$	$\iff true$
$t_{S^n} \stackrel{def}{=} ((f)^{n.S.0} @^{n.S.L} \langle x \rangle^{n.S.2}) @^{n.S.3} (\langle g \rangle^{n.S.1} @^{n.S.R} \langle x \rangle^{n.S.2})$	
$t_{F^n} \stackrel{def}{=} (\langle y \rangle^{n.F.2} @^{n.F.M} \langle u \rangle^{n.F.L}) @^{n.F.3} \langle v \rangle^{n.F.R}$	

OCFA for SF-calculus — Analysis Rules

Base Labels	n
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Labelled Terms	$t ::= S^n \mid F^n \mid t_1 @^l t_2 \mid \langle x \rangle^l$
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$\Gamma, \varphi \models t_1^l @^{l_3} t_2^{l_2}$	$\iff \Gamma, \varphi \models t_1 \wedge \Gamma, \varphi \models t_2$ \dots $\wedge \exists @^{l_4, l_5} \in \Gamma(l_3). \Gamma(l_4) \subseteq \Gamma(l_4) \wedge \Gamma(l_5) \subseteq \Gamma(l_5)$ $\wedge \forall F_0^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.F.0) \wedge F_1^n \in \Gamma(l_3)$ $\wedge \forall F_1^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.F.1) \wedge F_2^n \in \Gamma(l_3)$ $\wedge \forall F_2^n \in \Gamma(l_1). \Gamma(l_2) \subseteq \Gamma(n.F.2) \wedge \Gamma(n.F.3) \subseteq \Gamma(l_3) \wedge \varphi(n)$
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OCFA for SF-calculus — Analysis Rules



At F^0 : $F_0^0 \in \Gamma(0)$

\Downarrow

At $@^1$: $F_1^0 \in \Gamma(1)$ $\Gamma(2) \subseteq \Gamma(0.F.0)$

\Downarrow

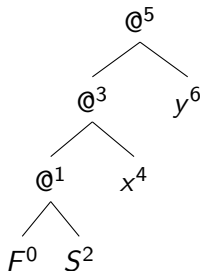
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\Downarrow

OCFA for SF-calculus — Analysis Rules



Suppose $f = S$:

$$S_0^2 \in \Gamma(2)$$

$$\Downarrow$$

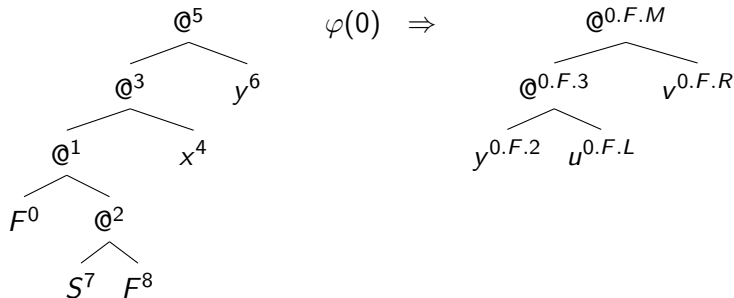
$$S_0^2 \in \Gamma(0.F.0)$$

$$\Downarrow$$

$$\Gamma(0.F.1) \subseteq \Gamma(0.F.3)$$

$$\text{So : } \Gamma(4) \subseteq \Gamma(0.F.1) \subseteq \Gamma(0.F.3) \subseteq \Gamma(5)$$

OCFA for SF-calculus — Analysis Rules



Suppose $f = u v = S F$:

$$\begin{array}{ccc}
 \varphi(0) & S_1^7 \in \Gamma(2) & \text{At } @^2: \quad @^{7,8} \in \Gamma(2) \\
 \Downarrow & \Downarrow & \Downarrow \\
 & S_1^7 \in \Gamma(0.F.0) & @^{7,8} \in \Gamma(0.F.0) \\
 & \Downarrow & \Downarrow \\
 & \Gamma(7) \subseteq \Gamma(0.F.L) & \Gamma(8) \subseteq \Gamma(0.F.R)
 \end{array}$$

OCFA for SF-calculus — Properties

Relationship with OCFA for SK-calculus:

- ▶ Encoding an SK-calculus program in SF-calculus with K as $F F$, the two analyses give the same results.
- ▶ OCFA for SF-calculus retains **polynomial time-complexity**.

Sources of **imprecision**:

- ▶ As with OCFA for λ -calculus, the analysis conflates multiple uses of the same argument.
- ▶ If our analysis of the 1st argument of F is imprecise, we may activate constraints for both rules, when really only one case applies.
- ▶ If an F can use both rules, we apply both sets of constraints to all arguments, not just those that activate the rules.
- ▶ If two distinct applications are factorised by the same F , we lose co-ordination between them.
- ▶ When we factorise abstractly, we have no way of discarding unfactorable forms.

Conclusion

Contributions:

- ▶ A formulation of OCFA for SK-calculus.
- ▶ A formulation of OCFA for SF-calculus.
 - ▶ **The first static analysis for SF-calculus.**
- ▶ Correctness proofs and preliminary evaluation for the above.

Future work:

- ▶ A translation from a **higher-level language into SF-calculus.**
- ▶ Address sources of imprecision in analysis.
- ▶ Try extending other CFA-style analyses (k -CFA, CFA2, ...) to SF-calculus.

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Thanks for listening. Questions are welcome.

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