

Typing Multi-Staged Programs and Beyond

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12/3/2010 @ Tsinghua Univ., Beijing

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We want to help reduce/eliminate errors in software.

- statically: before execution, before sell/embed
- automatically: against explosive sw size
- to find bugs or verify their absence

Our approach:

- “semantics-based static analysis”
- and lots of engineering



R&D of static software analysis tools:

“SW MRI” “SW fMRI” “SW PET”



Our Activities

We publicize our works in:

- POPL('06, '11), CAV('08), VMCAI('10, '11), ICSE('11), SAS, OOPSLA, FSE, etc.
- ACM TOPLAS, TCS, JFP, SP&E, Acta Informatica, etc.

A commercialization:



Research areas: *static analysis, abstract interpretation, programming language theory, type system, theorem proving, model checking, & whatever relevant* (don't care: orthodox or unorthodox)



1. Multi-staged Programming
2. Typing Multi-Staged Programs
3. Static Analysis of Multi-Staged Programs
4. Conclusion



program texts (code) as first class objects
“meta programming”

A general concept that subsumes

- macros
- Lisp/Scheme's quasi-quotation
- partial evaluation
- runtime code generation

Common in mainstream pgm'ng: Lisp/Scheme, C's macros, C++'s templates, C#, JavaScript, PHP, Python, etc.



Multi-Staged Programming (2/2)

- divides a computation into stages
- program at stage 0: conventional program
- program at stage $n + 1$: code as data at stage n

Stage	Computation	Value
0	usual + code + eval	usual + code
> 0	code substitution	code



Multi-Staged Programming Examples (1/2)

In examples, we will use Lisp-style staging constructs + only 2 stages

$$e ::= \dots$$

	<code>'e</code>	code as data
	<code>,e</code>	code substitution
	<code>eval e</code>	execute code



Multi-Staged Programming Examples (1/2)

In examples, we will use Lisp-style staging constructs + only 2 stages

$$e ::= \dots$$

	' <i>e</i>	code as data
	, <i>e</i>	code substitution
	eval <i>e</i>	execute code

Code as data

```
let NULL = '0
let body = '(if e = ,NULL then abort() ...)
in eval body
```



Multi-Staged Programming Examples (2/2)

Specializer/Partial evaluator

```
power(x,n) = if n=0 then 1 else x * power(x,n-1)
```

v.s. `power(x,3) = x*x*x`

prepared as

```
let spower(n) = if n=0 then '1 else '(x*,(spower (n-1)))
let fastpower10 = eval '(λx.,(spower 10))
in fastpower10 2
```



Review: Practice of Multi-Staged Programming



Features of Lisp/Scheme's quasi-quotation system



Review: Practice of Multi-Staged Programming

- open code

`'(x+1)`



Features of Lisp/Scheme's quasi-quotation system

ROSAEC center
Research Center for Software Analysis for Error-free Computing
소프트웨어 무결성 연구센터 KOSEF ERC

Review: Practice of Multi-Staged Programming

- open code

```
'(x+1)
```

- intentional variable-capturing substitution at stages > 0

```
'(\lambdax. , (spower 10))
```



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Review: Practice of Multi-Staged Programming

- open code

`'(x+1)`

- intentional variable-capturing substitution at stages > 0

`'(λx. , (spower 10))`

- capture-avoiding substitution

`'(λ*x. , (spower 10) + x)`



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Review: Practice of Multi-Staged Programming

- open code

`'(x+1)`

- intentional variable-capturing substitution at stages > 0

`'(λx. , (spower 10))`

- capture-avoiding substitution

`'(λ*x. , (spower 10) + x)`

- imperative operations with open code

`cell := '(x+1); ... cell := '(y 1);`

Features of Lisp/Scheme's quasi-quotation system



A static type system that supports the practice.

Should allow programmers both

- type safety and
- the expressiveness of fully-fledged multi-staging operators

Existing type systems support only part of the practice.



Challenge II

A general, static analysis method for multi-staged programs.

The objects (program texts) to analyze

- are dynamic entities, which
- are only estimated by static analysis
- breaking the basic assumption of conventional static analysis

No general static analysis method yet.



A type system for ML + Lisp's quasi-quote system

- supports multi-staged programming practice
 - open code: `'(x+1)`
 - unrestricted imperative operations with open code
 - intentional var-capturing substitution at stages > 0
 - capture-avoiding substitution at stages > 0
- conservative extension of ML's let-polymorphism
- principal type inference algorithm



A static analysis framework = unstaging-translate; analyze; project
apply an unstaging translation;
apply conventional static analysis techniques;
cast the analysis result back in terms of multi-staged programs
Theory

- the unstaing translation is “correct”
- a safe condition for the projection operation



A Let-Polymorphic Modal Type System for Lisp-style MSP [Kim, Yi, Calcagno: POPL'06]



Comparison

- | | |
|---------------------------|-----------------------------|
| (1) closed code and eval | (2) open code |
| (3) imperative operations | (4) type inference |
| (5) var-capturing subst. | (6) capture-avoiding subst. |
| (7) polymorphism | |

Our system

[Rhiger 2005]	+1	+2	+3	+4	+5	+6	+7
[Calcagno et al. 2004]	+1	+2	+3	-4	+5	-6	-7
[Ancona & Moggi 2004]	+1	+2	-3	+4	-5	+6	+7
[Ancona & Moggi 2004]	+1	+2	+3	-4	-5	+6	-7
[Taha & Nielson 2003]	+1	+2	-3	-4	-5	+6	+7
[Chen & Xi 2003]	+1	+2	+3	-4	+5	-6	+7
[Nanevsky & Pfenning 2002]	+1	+2	+3	-4	-5	+6	-7
MetaML/Ocaml[2000,2001]	+1	+2	-3	+4	-5	+6	+7
[Davies 1996]	-1	+2	-3	-4	-5	+6	-7
[Davies & Pfenning 1996,2001]	+1	-2	+3	+4	-5	+6	-7



- code's type: parameterized by its expected context

$$\Box(\Gamma \triangleright int)$$

- view the type environment Γ as a record type

$$\Gamma = \{x : int, y : int \rightarrow int, \dots\}$$

- stages by the stack of type environments (modal logic S4)

$$\Gamma_0 \cdots \Gamma_n \vdash e : A$$

- with “due” restrictions
 - let-polymorphism for syntactic values
 - monomorphic Γ in code type $\Box(\Gamma \triangleright int)$
 - monomorphic store types

Natural ideas worked.



Multi-Staged Language

$e ::=$	$c \mid x \mid \lambda x.e \mid e e$		
	$\text{box } e$	code as data	$\langle e$
	$\text{unbox}_k e$	code substitution	$, \dots, e$
	$\text{eval } e$	execute code	
	$\lambda^* x.e$	gensym	
	\dots		

Evaluation

$$\mathcal{E} \vdash e \xrightarrow{n} r$$

where

\mathcal{E} : value environment

n : a stage number

r : a value or err



Operational Semantics (stage $n \geq 0$)

- at stage 0: normal evaluation + code + eval
- at stage > 0 : code substitution

$$\text{(EBOX)} \quad \frac{\mathcal{E} \vdash e \xrightarrow{n+1} v}{\mathcal{E} \vdash \mathbf{box} e \xrightarrow{n} \mathbf{box} v}$$

$$\text{(EUNBOX)} \quad \frac{\mathcal{E} \vdash e \xrightarrow{0} \mathbf{box} v \quad k > 0}{\mathcal{E} \vdash \mathbf{unbox}_k e \xrightarrow{k} v}$$

$$\text{(EEVAL)} \quad \frac{\mathcal{E} \vdash e \xrightarrow{0} \mathbf{box} v \quad \mathcal{E} \vdash v \xrightarrow{0} v'}{\mathcal{E} \vdash \mathbf{eval} e \xrightarrow{0} v'}$$



Simple Type System (1/2)

Type $A, B ::= \iota \mid A \rightarrow B \mid \Box(\Gamma \triangleright A)$

code type

$\text{'(x+1): } \Box(\{x : \text{int}, \dots\} \triangleright \text{int})$

typing judgment

$\Gamma_0 \dots \Gamma_n \vdash e : A$



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typing judgment

$\Gamma_0 \cdots \Gamma_n \vdash e : A$

(TSBOX)
$$\frac{\Gamma_0 \cdots \Gamma_n \Gamma \vdash e : A}{\Gamma_0 \cdots \Gamma_n \vdash \text{box } e : \Box(\Gamma \triangleright A)}$$

(TSUNBOX)
$$\frac{\Gamma_0 \cdots \Gamma_n \vdash e : \Box(\Gamma_{n+k} \triangleright A)}{\Gamma_0 \cdots \Gamma_n \cdots \Gamma_{n+k} \vdash \text{unbox}_k e : A}$$

(TSEVAL)
$$\frac{\Gamma_0 \cdots \Gamma_n \vdash e : \Box(\emptyset \triangleright A)}{\Gamma_0 \cdots \Gamma_n \vdash \text{eval } e : A}$$
 (for alpha-equiv. at stage 0)



Simple Type System (2/2)

$$\text{(TSCON)} \quad \Gamma_0 \cdots \Gamma_n \vdash c : \iota$$

$$\text{(TSVAR)} \quad \frac{\Gamma_n(x) = A}{\Gamma_0 \cdots \Gamma_n \vdash x : A}$$

$$\text{(TSABS)} \quad \frac{\Gamma_0 \cdots (\Gamma_n + x : A) \vdash e : B}{\Gamma_0 \cdots \Gamma_n \vdash \lambda x. e : A \rightarrow B}$$

$$\text{(TSGENSYM)} \quad \frac{\Gamma_0 \cdots (\Gamma_n + w : A) \vdash [x^n \overset{n}{\mapsto} w] e : B \quad \text{fresh } w}{\Gamma_0 \cdots \Gamma_n \vdash \lambda^* x. e : A \rightarrow B}$$

$$\text{(TSAPP)} \quad \frac{\Gamma_0 \cdots \Gamma_n \vdash e_1 : A \rightarrow B \quad \Gamma_0 \cdots \Gamma_n \vdash e_2 : A}{\Gamma_0 \cdots \Gamma_n \vdash e_1 e_2 : B}$$



A combination of

- ML's let-polymorphism
 - syntactic value restriction + multi-staged “expansiveⁿ(e)”
 - expansiveⁿ(e) = *False*
 - ⇒ e never expands the store during its eval. at $\forall \text{stages} \leq n$

e.g.) $(\lambda x. e) \quad :$ can be expansive
 $(\lambda x. \text{eval } y) \quad :$ unexpansive

- Rémy's record types [Rémy 1993]
 - type environments as record types with field addition
 - record subtyping + record polymorphism



- if e then $'(x+1)$ else $'1$: $\boxed{\square(\{x : int\}\rho \triangleright int)}$
 - then-branch: $\square(\{x : int\}\rho' \triangleright int)$
 - else-branch: $\square(\rho'' \triangleright int)$
- let $x = 'y$ in $'(, x + w)$; $'((, x 1) + z)$
 $\boxed{x: \forall \alpha \forall \rho. \square(\{y : \alpha\}\rho \triangleright \alpha)}$
 - first x : $\square(\{y : int, w : int\}\rho' \triangleright int)$
 - second x : $\square(\{y : int \rightarrow int, z : int\}\rho'' \triangleright int \rightarrow int)$



typing judgment

$$\Delta_0 \cdots \Delta_n \vdash e : A$$

$$\text{(TBOX)} \quad \frac{\Delta_0 \cdots \Delta_n \Gamma \vdash e : A}{\Delta_0 \cdots \Delta_n \vdash \text{box } e : \square(\Gamma \triangleright A)}$$

$$\text{(TUNBOX)} \quad \frac{\Delta_0 \cdots \Delta_n \vdash e : \square(\Gamma \triangleright A) \quad \Delta_{n+k} \succ \Gamma \quad k > 0}{\Delta_0 \cdots \Delta_n \cdots \Delta_{n+k} \vdash \text{unbox}_k e : A}$$

$$\text{(TEVAL)} \quad \frac{\Delta_0 \cdots \Delta_n \vdash e : \square(\emptyset \triangleright A)}{\Delta_0 \cdots \Delta_n \vdash \text{eval } e : A}$$



Polymorphic Type System (4/4)

$$\text{(TVAR)} \quad \frac{\Delta_n(x) \succ A}{\Delta_0 \cdots \Delta_n \vdash x : A}$$

$$\text{(TABS)} \quad \frac{\Delta_0 \cdots (\Delta_n + x : A) \vdash e : B}{\Delta_0 \cdots \Delta_n \vdash \lambda x. e : A \rightarrow B}$$

$$\text{(TAPP)} \quad \frac{\Delta_0 \cdots \Delta_n \vdash e_1 : A \rightarrow B \quad \Delta_0 \cdots \Delta_n \vdash e_2 : A}{\Delta_0 \cdots \Delta_n \vdash e_1 e_2 : B}$$

$$\text{(TLETIMP)} \quad \frac{\text{expansive}^n(e_1) \quad \Delta_0 \cdots \Delta_n \vdash e_1 : A \quad \Delta_0 \cdots \Delta_n + x : A \vdash e_2 : B}{\Delta_0 \cdots \Delta_n \vdash \text{let } (x \ e_1) \ e_2 : B}$$

$$\text{(TLETAPP)} \quad \frac{\neg \text{expansive}^n(e_1) \quad \Delta_0 \cdots \Delta_n \vdash e_1 : A \quad \Delta_0 \cdots \Delta_n + x : \text{GEN}_A(\Delta_0 \cdots \Delta_n) \vdash e_2 : B}{\Delta_0 \cdots \Delta_n \vdash \text{let } (x \ e_1) \ e_2 : B}$$



Type Inference Algorithm

- Unification:
 - Rémy's unification for record type Γ
 - usual unification for new type terms such as $\square(\Gamma \triangleright A)$ and A ref
- Type inference algorithm:
 - the same structure as top-down version \mathcal{M} [Lee and Yi 1998] of the \mathcal{W}
 - usual on-the-fly instantiation and unification



Type Inference Algorithm

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 - usual on-the-fly instantiation and unification

Sound If $\text{infer}(\emptyset, e, \alpha) = S$ then $\emptyset; \emptyset \vdash e : S\alpha$.

Complete If $\emptyset; \emptyset \vdash e : R\alpha$ then $\text{infer}(\emptyset, e, \alpha) = S$ and $R = TS$ for some T .



A type system for multi-staged programming practice (ML + Lisp's quasi-quote)

- conservative extension to ML's let-polymorphism
- principal type inference algorithm

Exact details, lemmas, proof sketches, and embedding relations in the POPL'06 paper; full proofs in its companion technical report.



A type system for multi-staged programming practice (ML + Lisp's quasi-quote)

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Staged programming “practice” has a sound static type system.



Static Analysis of Multi-Staged Programs via Unstaging Translation [Choi, Aktemur, Yi, Tatsuda: POPL'11]



Challenge (rephrase)

A general, static analysis method for multi-staged programs.

The objects (program texts) to analyze

- are dynamic entities, which
- are only *estimated* by static analysis
- breaking the basic assumption of conventional static analysis

How to statically analyze the semantics of code generated-and-run by the program?



```
x := '0;  
repeat  
    x := '(, x + 2)  
until cond;  
run x
```

- The set of possible code for *x*:

$$\{ '0, '(0+2), '(0+2+2), \dots \}.$$

must first be finitely approximated, e.g., by a grammar:

$$S \rightarrow 0 \mid S+2.$$

- analyzing “run *x*” requires every code implied by the grammar must be exposed first!?



a three-step approach: translate, analyze, and project.

1. unstaging translation

- proof of semantic-preserving

2. conventional static analysis

- can apply all existing static analysis techniques

3. cast the result back in terms of original staged programs

- a sound condition for the projection
- i.e., to be aligned with the correspondence induced by the translation.



Unstaging Translation

The previous example is translated as

```
x := λρ.0;  
repeat  
  x := (λh.(λρ.(h ρ)+2)) x  
until cond;  
(x {})
```

- Code into env-taking function:

$$'0 \mapsto \lambda\rho.0$$

- The run expression into an application:

$$\text{run } '0 \mapsto (\lambda\rho.0)\{\}$$

- Free variables in a code into record accesses. $'x \mapsto \lambda\rho.\rho.x$

- Code composition $'(, x + 2)$ into a ftn-generating app.
whose actual param. is the part for the code-to-be-plugged
expr.:

$$'(, x + 2) \mapsto (\lambda h. (\lambda \rho. (h \rho) + 2))$$

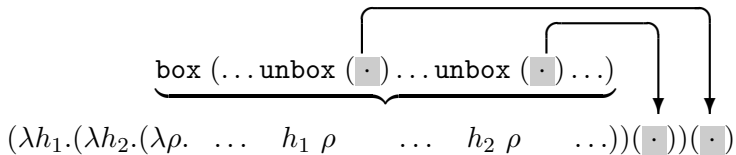



Illustration of the translation of a box expression with two unboxes.



Theorem

(Simulation) Let e be a stage- n λ_S expression with no free variables such that $e \xrightarrow{n} e'$. Let $R \vdash e \mapsto (\underline{e}, K)$ and $R \vdash e' \mapsto (\underline{e}', K')$. Then $K(\underline{e}) \xrightarrow{\mathcal{R}; \mathcal{A}^} K'(\underline{e}')$.*

$$\begin{array}{ccc} e & \xrightarrow{n} & e' \\ \downarrow & & \downarrow \\ \underline{e} & & \underline{e}' \end{array} \quad \Longrightarrow \quad \underline{e} \xrightarrow{\mathcal{R}; \mathcal{A}^*} \underline{e}'$$



Theorem

(Inversion) Let e be a λ_S expression and R be an environment stack. If $R \vdash e \mapsto (\underline{e}, K)$, then $H \vdash \underline{e} \mapsto e$ for any H such that $\overline{K} \subseteq H$.

$$e \xrightarrow{n} e' \quad \Longrightarrow \quad \begin{array}{ccc} e & & e' \\ \hline \downarrow & & \uparrow \\ \underline{e} & \xrightarrow{R; A^*} & \underline{e'} \end{array}$$



$$\begin{array}{ccc}
 e & & \\
 \downarrow & & \\
 \underline{e} & & \\
 & \begin{array}{ccc}
 \llbracket e \rrbracket \in D_S & \xrightleftharpoons[\alpha]{\gamma} & \hat{D}_S \ni \llbracket \hat{e} \rrbracket \\
 \uparrow \pi & & \uparrow \hat{\pi} \\
 \llbracket \underline{e} \rrbracket \in D_R & \xrightleftharpoons[\alpha]{\gamma} & \hat{D}_R \ni \llbracket \underline{\hat{e}} \rrbracket
 \end{array} &
 \end{array}$$

Theorem

(Safe Projection) Let e and \underline{e} be, respectively, a staged program and its translated unstaged version. If $\llbracket e \rrbracket \sqsubseteq \pi \llbracket \underline{e} \rrbracket$ and $\alpha \circ \pi \circ \gamma \sqsubseteq \hat{\pi}$ then $\alpha \llbracket e \rrbracket \sqsubseteq \hat{\pi} \llbracket \underline{\hat{e}} \rrbracket$.



Example (1/2)

After translation:

```
x := λρ1.0;  
repeat  
  x := (λh.(λρ2.(h ρ2)1 + 2)) x  
until cond;  
(x {})2
```

Analysis: collecting/resolving constraints

$$V_x \ni \lambda\rho_1$$

$$V_x \ni \lambda\rho_2$$

$$V_h \ni V_x$$

$$V_h \ni \lambda\rho_1$$

$$V_h \ni \lambda\rho_2$$

$$V_1 \ni 0$$

$$V_1 \ni V_1+2$$

$$V_2 \ni 0$$

$$V_2 \ni V_1+2$$

then the analysis may conclude

$$V_1 \rightarrow 0 \mid V_1+2$$

$$V_2 \rightarrow 0 \mid V_1+2$$



Example (2/2)

Projection: cast the analysis results back in terms of the original staged program

```
 $x := '0;$   
repeat  
   $x := '(,x + 2)$   
until cond;  
run  $x$ 
```

- V_h 's values $\lambda\rho_1$ and $\lambda\rho_2$ are projected to code exprs. $'0$ and $'(,x + 2)$.
- i.e., code to be plugged into the place of “, x ” can be $'0$ and, recursively, $'(,x + 2)$.
- Underlying projections satisfy the safety conditions.



A static analysis method for multi-staged programs

- semantic-preserving unstaging translation
- sound projection of conventional analysis for unstaged program back in terms of original, staged program

Exact details, lemmas, proof sketches in the POPL'11 paper; full proofs in its companion technical report.



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Thank you.

