# Typed Lambda Calculus and the Semantics of Programs

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# **Programming Languages Forever**

Hundreds of programming languages invented.

Haskell, Java, C, C++, OCaml, LISP, Scheme, Basic, Pascal, ...

- More born all the time (and few die...).
- Why?
- Aren't Turing machines enough?

### Language Variety

- Languages are centered around different organizing ideas.
  - ► Object-oriented programming (Java, C++, Ruby, Scala)

```
List 1 = new LinkedList();
1.add(4); 1.add(3); 1.add(2); 1.add(1);
Collections.reverse(1);
```

► Functional programming (LISP, OCaml, Haskell)

```
List.rev [ 4; 3; 2; 1 ]
```

- More: imperative programming, logic programming.
- Tailored to different domains (web, database, scientific, etc.).
- Provide different mechanisms for abstraction...
- ...often through typing.

# Typing Example: List.rev in OCaml

```
List.rev: 'a list -> 'a list
```

- This type says that List.rev is a function where for any type 'a:
  - ► the argument should be a list of 'a things.
  - ► the result (if any) will be a list of 'a things.
- Can operate on list with any element type:
  - ► List.rev [3;2;1]
  - ► List.rev ["hi"; "bve"; "whv"]
  - etc.
- List.rev's type abstracts all the rest of its behavior.

### **How Types Abstract**

- Many different functions have type 'a list -> 'a list:
  - ▶ List.rev.
  - ► List.tl which maps [4;3;2;1] to [3;2;1].
  - ▶ id, the identity function.
  - ▶ loop, the function which runs forever.
  - ► myfunc with myfunc [a;b;...] = [b;a;...]
  - etc.
- Type denotes set of all functions with the specified behavior.
- Informally:

```
[\![T]\!] = \{f \mid f \text{ has behavior described by } T\}
```

#### Lambda Calculus

- Proposed by Alonzo Church as basis for logic.
  - ["The Calculi of Lambda Conversion," 1941]
- Widely adopted as a language for describing functions:
  - ▶ in Linguistics: for semantics.
  - ▶ in Logic: for higher-order logic, proof theory.
  - ▶ in Computer Science: for functional programming languages.
- Comes in untyped and typed varieties.
- Appeal is its simplicity and power.

### Untyped Lambda Calculus

#### Syntax:

terms 
$$t ::= x \mid t t' \mid \lambda x. t$$

#### Reduction Semantics:

$$\frac{t \leftrightarrow t'}{(\lambda x. t) t' \leftrightarrow [t'/x]t} \frac{t \leftrightarrow t'}{\lambda x. t \leftrightarrow \lambda x. t'}$$

$$\frac{t_1 \leftrightarrow t'_1}{(t_1 t_2) \leftrightarrow (t'_1 t_2)} \frac{t_2 \leftrightarrow t'_2}{(t_1 t_2) \leftrightarrow (t_1 t'_2)}$$

[t'/x]t denotes result of substituting t' for x in t.

#### Example:

$$((((\lambda x.\lambda y.\lambda z.x)3)4)5) \rightsquigarrow (((\lambda y.\lambda z.3)4)5) \rightsquigarrow ((\lambda z.3)5) \rightsquigarrow 3$$

#### The Power of Lambda Calculus

#### Looping computation:

```
(\lambda x.(x \ x)) \ (\lambda x.(x \ x)) \implies [\lambda x.(x \ x)/x](x \ x)
= \ (\lambda x.(x \ x)) \ (\lambda x.(x \ x))
\implies (\lambda x.(x \ x)) \ (\lambda x.(x \ x))
\implies \cdots
```

#### Iterating computation *f*:

```
(\lambda x.(f(x x))) (\lambda x.(f(x x))) \rightarrow f((\lambda x.(f(x x))) (\lambda x.(f(x x)))) \\ \rightarrow f(f(\lambda x.(f(x x))) (\lambda x.(f(x x)))) \\ \rightarrow f(f(f(\lambda x.(f(x x))) (\lambda x.(f(x x)))))
```

#### Lambda-Encoded Data

- Can represent numbers, lists, etc. as lambda terms.
- Church encoding:

$$0 := \lambda s.\lambda z.z 
1 := \lambda s.\lambda z.s z 
2 := \lambda s.\lambda z.s (s z) 
...$$

Taking the successor of a Church-encoded number:

$$Succ := \lambda n.(\lambda s. \lambda z. s (n s z))$$

Succ 1 
$$\rightsquigarrow \lambda s.\lambda z.s$$
 (1 s z)  $\rightsquigarrow^* \lambda s.\lambda z.s$  (s z) = 2

Addition for Church encoding:

$$plus := \lambda n. \lambda m. n$$
 Succ m

### Typed Lambda Calculi

- Practical languages have primitive data, operations.
- Types used to enforce safe usage:

```
\begin{array}{cccc} 12 & : & \textit{int} \\ + & : & \textit{int} \rightarrow \textit{int} \rightarrow \textit{int} \\ \text{"hi"} & : & \textit{string} \end{array}
```

- Typed lambda calculi are theoretical basis.
- Many different type systems proposed.
- Goal: prove type system sound:

"Well typed programs do not go wrong." [Milner]

```
► t: T \implies t \ Ok

► t: T \land t \leadsto t' \implies t': T (e.g., 3+3: int \land 3+3 \leadsto 6)
```

# Example: Simply Typed Lambda Calculus

#### Syntax of Types:

base types 
$$b$$
 simple types  $T$  ::=  $b \mid T_1 \rightarrow T_2$ 

#### Semantics:

$$\llbracket b \rrbracket_{\sigma} = \sigma(b)$$

$$\llbracket T_1 \to T_2 \rrbracket_{\sigma} = \{ t \in \textit{terms} \mid \forall t' \in \llbracket T_1 \rrbracket_{\sigma}. \ (t \ t') \in \llbracket T_2 \rrbracket_{\sigma} \}$$

Assume  $\sigma(b)$  inversion-reduction closed (for all b):

$$\frac{t' \rightsquigarrow t \qquad t \in \sigma(b)}{t' \in \sigma(b)}$$

# Example of Using the Semantics

$$\lambda x.\lambda y.x \in \llbracket b_1 \rightarrow b_2 \rightarrow b_1 \rrbracket_{\sigma}$$

#### Proof.

Assume arbitrary  $t_1 \in \llbracket b_1 \rrbracket_{\sigma} = \sigma(b_1)$ . Show  $(\lambda x. \lambda y. x)$   $t_1 \in \llbracket b_2 \to b_1 \rrbracket_{\sigma}$ .

Assume arbitrary  $t_2 \in [\![b_2]\!]_{\sigma} = \sigma(b_2)$ .

Show  $((\lambda x.\lambda y.x) \ t_1) \ t_2 \in \llbracket b_1 \rrbracket_{\sigma} = \sigma(b_1).$ 

Holds because  $((\lambda x.\lambda y.x) t_1) t_2 \rightsquigarrow^* t_1 \in \sigma(b_1)$ 

# **Typing Semantics**

$$\frac{\Gamma(x) = T}{\Gamma \vdash x : T} \quad \frac{\Gamma, x : T_1 \vdash t : T_2}{\Gamma \vdash \lambda x . t : T_1 \rightarrow T_2} \quad \frac{\Gamma \vdash t_1 : T_2 \rightarrow T_1 \quad \Gamma \vdash t_2 : T_2}{\Gamma \vdash t_1 \ t_2 : T_1}$$

- Logically less complex notion of typing.
- Basis for actual type-checking algorithms.
- Can be proved sound:

#### Theorem (Soundness)

If 
$$\Gamma \vdash t : T$$
, then  $\gamma t \in [\![T]\!]_{\sigma}$ , where

$$\gamma(x) \in \llbracket \Gamma(x) \rrbracket_{\sigma} \text{ for all } x \in dom(\sigma).$$

$$\frac{\Gamma(x) = T}{\Gamma \vdash x : T} \quad \frac{\Gamma, x : T_1 \vdash t : T_2}{\Gamma \vdash \lambda x . t : T_1 \rightarrow T_2} \quad \frac{\Gamma \vdash t_1 : T_2 \rightarrow T_1 \quad \Gamma \vdash t_2 : T_2}{\Gamma \vdash t_1 \ t_2 : T_1}$$

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$$\frac{\Gamma}{\Gamma \vdash T} \quad \frac{T}{\Gamma \vdash T_1 \to T_2} \quad \frac{\Gamma \vdash T_2 \to T_1 \quad \Gamma \vdash T_2}{\Gamma \vdash T_1 \to T_2}$$

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$$\frac{\Gamma}{\Gamma \vdash T} \quad \frac{T}{\Gamma \vdash T_1 \to T_2} \quad \frac{\Gamma \vdash T_2 \to T_1 \quad \Gamma \vdash T_2}{\Gamma \vdash T_1 \to T_2}$$

$$\frac{T \vdash \Gamma}{\Gamma \vdash T} \quad \frac{\Gamma, T_1 \vdash T_2}{\Gamma \vdash T_1 \to T_2} \quad \frac{\Gamma \vdash T_2 \to T_1 \quad \Gamma \vdash T_2}{\Gamma \vdash T_1}$$

### **Proofs and Programs**

- Simply typed lambda terms are notations for proofs.
- The logic is minimal (constructive) propositional logic.
- The semantics of types <-> Kripke semantics for minimal logic.
- Let Norm be set of normalizing lambda terms.
  - ▶  $t \in Norm \text{ iff } \exists t'.t \rightsquigarrow^* t' \not \rightsquigarrow$ .
- Can prove:

#### **Theorem**

Suppose  $\sigma(b) \subseteq Norm$  (for all b).

Then  $[\![T]\!]_{\sigma} \subseteq Norm$ .

#### Corollary

Simply typable terms are normalizing.

### The Tragedy of Programming

- Programs are full of bugs.
  - ▶ 1-10 for every 1000 lines of code?
  - Ok for web browser, not for flight control.
- State of the art: testing.
- We are building cathedrals of glass with jack hammers.
- But a new hope dawns...

### Programming with Proofs

- Lambda calculus: bridge between programming, proving.
- Simply typed lambda calc. <-> min. prop. logic.
- Fancier type systems <-> more powerful logics.
- New generation of research languages:
  - ► Coq (INRIA), Agda (Chalmers), Ωmega (Portland), Guru (Iowa).
- Write programs, prove theorems about them.

$$\forall I$$
: list a. rev (rev I) = I

Write programs with rich types expressing properties.

rev : list a 
$$n \rightarrow list a n$$

I believe this is a true revolution in programming.

### Case Study: versat

- We wrote a verified logic solver in Guru.
  - Duckki Oe, Tianyi Liang, Corey Oliver, Kevin Clancy.
  - Guru is our verified-programming language.
- Modern solvers can solve huge logic problems.
  - ▶ 100s of thousands of propositional variables.
  - formulas with millions of logical operators.
  - sophisticated heuristics and optimizations.
- We proved (in Guru):
  - ▶ if the solver says the formula is unsatisfiable, then
  - one can derive a contradiction from it.
- 10k lines of code, proofs.
- Correct in theory, and in practice (compared to MiniSat).

### Richer Type Systems: Levelized

	• • •
superkinds :	kind
	• • •
kinds :	type
	$ extit{type}  ightarrow  extit{type}$
	• • •
types:	int
	$ extit{int}  ightarrow  extit{int}$
	$\forall X : type.X \rightarrow X,$
	$\lambda X$ : $type.X  o X$
terms :	35,
	$\lambda x.x + x$ ,
	• • •

# Richer Type Systems: Collapsed

- With levelized systems, each expression is in just one level.
- So cannot reuse that code across levels.
- Can view level structure this way:

$$type_0 : type_1 : type_2 : \cdots$$

An exciting idea:

- Collapses all levels; cannot distinguish terms, types.
- Great reuse: multi-level data structures.

$$\frac{\textit{list}: \textit{type} \rightarrow \textit{type} \quad \textit{type}: \textit{type}}{\textit{list type}: \textit{type}}$$

But: compositional semantics is quite challenging.

# Types As Abstractions

- Goal: define "simple" semantics for type:type.
- Idea: view every term as a description of a set of terms.
  - ►  $[int] = \{0, 1, 2, \dots\}$ ►  $[0] = \{0, ((\lambda x.x) \ 0), \dots\}$
  - ► **|** type || = { type, int, · · · }
- Levelize the semantics:  $[t]_{\sigma}^{k}$ .
- Crucial defining clause:

$$t_a \in \llbracket \lambda x : t_1.t_2 \rrbracket_{\sigma}^{k+1} \Longrightarrow \forall t_b \in \llbracket t_1 \rrbracket_{\sigma}^{k+1}.t_a \ t_b \in \llbracket t_2 \rrbracket_{\sigma[x \mapsto \llbracket t_b \rrbracket_{\sigma}^k]}^{k+1}$$

- Can interpret this argument *t<sub>b</sub>* at a lower level *k*.
- Handle case when  $t_b$  is a type or a term uniformly.

#### Conclusion

- Semantics is essential for programming language design.
  - ▶ reduction semantics for terms:  $(\lambda x.t)$   $t' \rightsquigarrow [t'/x]t$
  - compositional semantics of types: [[T]]<sub>σ</sub>
  - typing semantics: Γ ⊢ t : T
- Use semantics to prove type system sound.
- Typed lambda calculus for programs, proofs.
- Prove code is correct!
- Collapse language levels with type:type.
- Can "types as abstractions" yield compositional semantics?

http://queuea9.wordpress.com

#### Thanks!