Simple Type Inference



Announcements

Quiz 5

- No class on April 8th
- I have graded HW4

- HW6 is a team homework
- I will work on paper list, guidelines and presentation schedule over weekend



So far

- Introduction to types and type systems
- Simply typed lambda calculus (System F₁)
 - Language syntax, type expression syntax
 - Static semantics
 - Dynamic semantics
 - Type soundness: Safety = Progress + Preservation
 - Proved for the simply typed lambda calculus



Outline

- Simple type inference
 - Equality constraints
 - Unification
 - Substitution
 - Strategy 1: Constraint-based typing
 - Strategy 2: On-the-fly typing: Algorithm W, almost
- Parametric polymorphism (next time...)
- Hindley Milner type inference. Algorithm W



Reading

 "Types and Programming Languages", by Benjamin Pierce, Chapter 22, 23

Lecture notes based partially on MIT 2015
 Program Analysis OCW

Core Typing Rules

```
Type expressions:
 \Gamma \vdash c : int
                               [x:iut,y:iut\Rightarrow iut] \tau := int | \tau \rightarrow \tau
 x:\tau \subseteq \Gamma
                                   (Var)
                                                                 Environment:
 \Gamma \vdash x : \tau
                                                                 \Gamma ::= Nil \mid \Gamma, x:\tau
 5+x:0
\Gamma, x : \sigma \models E_1 : \tau
                                                       (Abc)
\Gamma \vdash (\lambda x : \sigma. \; \mathsf{E}_1) : \sigma \to \tau
\Gamma \vdash E_1 : \sigma \rightarrow \tau \quad \Gamma \vdash E_2 : \sigma \qquad (App)
         \Gamma \vdash (E_1 E_2) : \tau
```



Extensions to Core Typing Rules

$$\frac{\Gamma \models E_1 : int}{\Gamma \models c : int}$$

$$\frac{\Gamma \models E_1 + E_2 : int}{\Gamma \models E_1 + E_2 : int}$$

$$\Gamma \vdash E_1 : int$$
 $\Gamma \vdash E_2 : int$ (Comparison)
 $\Gamma \vdash E_1 = E_2 : bool$

$$\Gamma \models b : bool \quad \Gamma \models E_1 : \tau \quad \Gamma \models E_2 : \tau$$

$$\Gamma \models \text{ if b then } E_1 \text{ else } E_2 : \tau$$



Type Inference, Strategy 1

- We can figure out all types even without explicit types for variables
 - $(\lambda f. f. f. 5) (\lambda x. x+1) : ?$
 - Type inference

- Type inference, Strategy 1
 - Use typing rules to define type constraints
 - Solve type constraints
 - Aka constraint-based typing (e.g., Pierce)

Nil
$$\vdash$$
 $(\lambda f. fs)(\lambda x. x+1): t1$

1. App $\int_{t_1}^{t_2} \int_{t_2=t_4}^{t_2=t_4} t_2$

1. App $\int_{t_1}^{t_2=t_4} \int_{t_2=t_4}^{t_2=t_4} \int_$

We Can Infer All Types!

```
Γ |- E₁ : int
                                                                                                                        \Gamma \mid -E_2 : int
                                                                                                           \Gamma \mid - E_1 + E_2 : int
  • (\lambda f. f 5) (\lambda x. x+1) : ?
                                                                                                  \Gamma \mid - \mathsf{E}_1 : \sigma \rightarrow \tau
                                                                                                                        \Gamma \mid -E_2 : \sigma
                                                                                                           \Gamma \mid - (\mathsf{E}_1 \; \mathsf{E}_2) : \tau
                                     1. App
                                                                                                    \Gamma = \Pi
                                                                                                         t_4 = t_x \rightarrow t_5
             2. Abs
                                                                                     4. Abs
                                               \Gamma = [f:t_f]
                                                                                                                     \Gamma = [x:t_x]
                               3. App
                                                                                                                        t_5 = int
                                                                                                         5. +
\lambda f: t_f
                                                                      \lambda x: t_x
                                             t_f = int \rightarrow t_3
                                                                                                                        t_x = int
           Var f
                                      Const 5
                                                                                           Var x
                                                                                                                      Const 1
```

Type Constraints

- We constructed a system of type constraints
- Let's solve the system of constraints

$$t_2 = t_4 \rightarrow t_1$$
 $t_1 = int \rightarrow t_3 = t_4 = int \rightarrow int$ We inferred all t's! $t_2 = t_4 \rightarrow t_3$ $t_3 = int$ $t_1 = int$ $t_2 = (int \rightarrow int) \rightarrow int$ $t_4 = t_x \rightarrow t_5$ $t_4 = int \rightarrow int$ $t_5 = int$ $t_7 = int \rightarrow int$ $t_8 = int \rightarrow int$ $t_9 = int \rightarrow int$

• $(\lambda f: int \rightarrow int. f 5) (\lambda x: int. x+1) : int (t_1)$

have = $\lambda f. \lambda x. f(f \times 7)$

Another Example

twice
$$f x = f(f x)$$

• twice
$$f x = f(f x)$$

• What is the type of twice?

• $t_1 = t_1$

• $t_2 = t_1$

• $t_3 = t_4$

• $t_4 = t_2$

• $t_4 = t_4$

• $t_4 = t_$

Another Example

- twice f x = f (f x)
- What is the type of twice?
 - It is $t_f \rightarrow t_x \rightarrow t_1$ (t_1 is the type of f(f(x)))
- Based on the syntax tree of f (f x) we have:

$$t_f = t_2 \rightarrow t_1$$

$$t_f = t_x \rightarrow t_2$$

Thus, $\mathbf{t}_{\mathbf{x}} = \mathbf{t}_{1} = \mathbf{t}_{2}$, $\mathbf{t}_{f} = \mathbf{t}_{\mathbf{x}} \rightarrow \mathbf{t}_{\mathbf{x}}$ and

type of **twice** is $(t_x \rightarrow t_x) \rightarrow t_x \rightarrow t_x$

Note: t_x is a free type variable! Polymorphism! 13

Type Constraints from Typing Rules, as Attribute Grammar

• Syntax: $E := x | c | \lambda x.E | E_1 E_2 | E_1 + E_2$

Grammar rule: Attribute rule:

$$E := x \qquad C_E = \{ t_E = \Gamma_E(x) \}$$

$$E := c \qquad C_E = \{ t_E = int \}$$

$$E ::= \lambda x.E_1 \qquad \qquad \Gamma_{E1} = \Gamma_{E}; x:t_x$$

$$C_{\mathsf{F}} = C_{\mathsf{F}1} \cup \{ t_{\mathsf{F}} = t_{\mathsf{x}} \rightarrow t_{\mathsf{F}1} \}$$

$$\mathsf{E} ::= \mathsf{E}_1 \mathsf{E}_2 \qquad \qquad \mathsf{\Gamma}_{\mathsf{E} 1} = \mathsf{\Gamma}_{\mathsf{E}} \quad \mathsf{\Gamma}_{\mathsf{E} 2} = \mathsf{\Gamma}_{\mathsf{E}}$$

$$C_E = C_{E1} \cup C_{E2} \cup \{ t_{E1} = t_{E2} \rightarrow t_E \}$$

$$E ::= E_1 + E_2 \qquad \qquad \Gamma_{E1} = \Gamma_E \quad \Gamma_{E2} = \Gamma_E$$

$$C_E = C_{E1} \cup C_{E2} \cup \{ t_{E1} = int, t_{E2} = int, t_{E} = int \}$$

Type Constraints from Typing Rules, as Attribute Grammar



$$E ::= \lambda x.E_1$$

 $E := \lambda x.E_1 \qquad \lambda k. \qquad E_1$

□ is inherited. Propagates top-down the tree.

$$\begin{split} & \Gamma_{\text{E1}} = \Gamma_{\text{E}}; x : t_{x} \\ & C_{\text{E}} = C_{\text{E1}} \cup \left\{ t_{\text{E}} = t_{x} \rightarrow t_{\text{E1}} \right\} \end{split}$$

t_F is "fresh" type variable for term represented by E's subtree.

$$\mathsf{E} ::= \mathsf{E}_1 \mathsf{E}_2 \underbrace{\mathsf{E}_{\mathsf{C}}}_{\mathsf{E}_{\mathsf{C}}}$$

$$\Gamma_{E1} = \Gamma_{E} \quad \Gamma_{E2} = \Gamma_{E}$$

c collects constraints. It is synthesized.

Propagates bottom-up the tree.





Solving Constraints

- Two key concepts
- Equality
 - What does it mean for two types to be equal?
 - Structural equality (aka structural equivalence)
- Unification
 - Can two types be made equal by choosing appropriate substitutions for their type variables?
 - Robinson's unification algorithm (which you already know from Prolog!)

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Equality and Unification

What does it mean for two types τ_a and τ_b to be equal?

Structural equality

• Suppose
$$\tau_a = t_1 \rightarrow t_2$$

 $\tau_b = t_3 \rightarrow t_4$

Structural equality entails

$$\tau_a = \tau_b$$
 means $t_1 \rightarrow t_2 = t_3 \rightarrow t_4$ iff $t_1 = t_3$ and $t_2 = t_4$

•

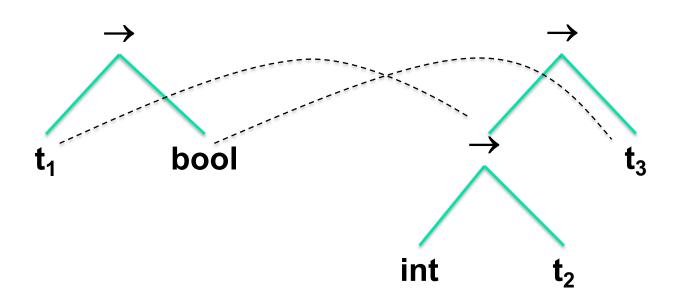
Equality and Unification

- Can two types be made equal by choosing appropriate substitutions for their type variables?
- Robinson's unification algorithm
 - Suppose $\tau_a = int \rightarrow t_1$ $\tau_b = t_2 \rightarrow bool$
 - Can we unify τ_a and τ_b? Yes, if bool/t₁ and int/t₂
 - Suppose $\tau_a = int \rightarrow t_1$ $\tau_b = bool \rightarrow bool$
 - Can we unify τ_a and τ_b ? No.



Example

$$t_1 \rightarrow bool = (int \rightarrow t_2) \rightarrow t_3$$



Yes, if $int \rightarrow t_2/t_1$ and $bool/t_3$

Simple Type Substitution (essential to define unification)

Language of types

```
\tau := \mathbf{b} // primitive type, e.g., int, bool
\mid \mathbf{t} \qquad \text{// type variable}
\mid \tau \rightarrow \tau \qquad \text{// function type}
```

- A substitution is a map
 - S : Type Variable → Type
 - $S = [\tau_1/t_1, \dots \tau_n/t_n]$ // substitute type τ_i for type var t_i
- A substitution instance τ = $S \tau$
 - $S = [t_0 \rightarrow bool / t_1]$ $\tau = t_1 \rightarrow t_1$ then
 - $S(\tau) = S(t_1 \rightarrow t_1) = (t_0 \rightarrow bool) \rightarrow (t_0 \rightarrow bool)$

Simple Type Substitution (essential to define unification)



- $S_1 = [t_0 \rightarrow bool / t_1]$
- $S_2 = [int / t_0]$
- $\tau = \mathbf{t}_1 \rightarrow \mathbf{t}_1$
- $S_2 S_1 (\tau) = S_2 (S_1 (t_1 \rightarrow t_1)) =$



Examples

- Substitutions can be composed
 - $S_1 = [t_x / t_1]$
 - $S_2 = [t_x / t_2]$
 - $\tau = \mathbf{t_2} \rightarrow \mathbf{t_1}$
 - $S_2 S_1 (\tau) = ?$



Examples

- Substitutions can be composed
 - $S_1 = [t_1 / t_2]$
 - $S_2 = [t_3 / t_1]$
 - $S_3 = [t_4 \rightarrow int / t_3]$
 - $\tau = \mathbf{t_1} \rightarrow \mathbf{t_2}$
 - $S_3 S_2 S_1 (\tau) = ?$



Some Terminology...

- A substitution S₁ is less specific (i.e., more general) than substitution S₂ if S₂ = S S₁ for some substitution S
 - E.g., $S_1 = [t_1 \rightarrow t_1 / t_2]$ is more general than $S_2 = [int \rightarrow int / t_2]$ because $S_2 = S_1$ for $S = [int / t_1]$
- A principal unifier of a constraint set C is a substitution S₁ that satisfies C, and S₁ is more general than any S₂ that satisfies C



Examples

- Find principal unifiers (when they exist) for
 - $\{ int \rightarrow int = t_1 \rightarrow t_2 \}$
 - $\{ int = int \rightarrow t_2 \}$
 - $\bullet \{ t_1 = int \rightarrow t_2 \}$
 - $\{ t_1 = int, t_2 = t_1 \rightarrow t_1 \}$

Unification (essential for type inference!)

• Unify: tries to unify τ_1 and τ_2 and returns a principal unifier for $\tau_1 = \tau_2$ if unification is successful

```
def Unify(\tau_1, \tau_2) =
                                                                            This is the occurs check!
   case (\tau_1, \tau_2)
       (\tau_1, \mathbf{t_2}) = [\tau_1/\mathbf{t_2}] provided \mathbf{t_2} does not occur in \tau_1
       (\mathbf{t}_1, \mathbf{\tau}_2) = [\mathbf{\tau}_2/\mathbf{t}_1] provided \mathbf{t}_1 does not occur in \mathbf{\tau}_2
       (b_1,b_2) = if (eq? b_1 b_2) then [] else fail
       (\tau_{11} \rightarrow \tau_{12}, \tau_{21} \rightarrow \tau_{22}) = \text{let } S_1 = \text{Unify}(\tau_{11}, \tau_{21})
                                                        S_2 = Unify(S_1(\tau_{12}), S_1(\tau_{22}))
                                               in S_2 S_1 // compose substitutions
```



Examples

■ Unify (int \rightarrow int, $t_1 \rightarrow t_2$) yields?

■ Unify (int, int→t₂) yields?

■ Unify $(t_1, int \rightarrow t_2)$ yields?



Unify Set of Constraints C

 UnifySet: tries to unify C and returns a principal unifier for C if unification is successful

```
def UnifySet (C) =
  if C is Empty Set then []
  else let
          \mathbf{C} = \{ \tau_1 = \tau_2 \} \cup \mathbf{C}'
          S = Unify (\tau_1, \tau_2) // Unify returns a substitution S
         in
          UnifySet (S(C'))S
          // Compose the substitutions
```

Examples

•
$$\{ t_1 = int, t_2 = t_1 \rightarrow t_1 \}$$

• { $t_2 = t_4 \rightarrow t_1$, $t_2 = t_f \rightarrow t_3$, $t_4 = t_x \rightarrow t_5$, $t_f = int \rightarrow t_3$, $t_5 = int$, $t_x = int$ }



Type Inference, Strategy 1

Aka constraint-based typing (e.g., Pierce)

- Traverse parse tree to derive a set of type constraints C
 - These are equality constraints
 - (Pseudo code in earlier slides)
- Solve type constraints offline
 - Use unification algorithm
 - (Pseudo code in earlier slide)



Outline

- Simple type inference
 - Equality constraints
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 - Substitution
 - Strategy 1: Constraint-based typing
 - Strategy 2: On-the-fly typing: Algorithm W, almost
- Parametric polymorphism (next time...)
- Hindley Milner type inference. Algorithm W



Type Inference, Strategy 2

 Strategy 1 collects all constraints, then solves them offline

- Strategy 2 solves constraints on the fly
 - Builds the substitution map incrementally

Add a New Attribute, Substitution Map **S**

Grammar rule:

Attribute rule:

T_E is the inferred type of E.
 S_E is the substitution map resulting from inferring T_E.
 t_x,t_E are fresh type variables.

$$E ::= x$$

$$E ::= c$$

$$E := \lambda x.E_1$$

$$T_E = \Gamma_E(x) S_E = []$$

$$T_E = int$$
 $S_E = []$

$$\Gamma_{E1} = \Gamma_{E}; x:t_{x}$$

$$T_E = S_{E1}(t_x) \rightarrow T_{E1}$$
 $S_E = S_{E1}$

$$E := E_1 E_2$$

$$\begin{split} & \Gamma_{E1} = \Gamma_E \quad \Gamma_{E2} = S_{E1}(\Gamma_E) \\ & S = Unify(S_{E2}(T_{E1}), T_{E2} \rightarrow t_E) \\ & T_E = S(t_E) \qquad S_E = S S_{E2} S_{E1} \end{split}$$

Example: $(\lambda f. f. f. f.)$

S = []

1. App $T_1 = int$

```
Steps at 1, finally:
1. unify( (int\rightarrowt<sub>3</sub>)\rightarrowt<sub>3</sub>, (t<sub>x</sub>\rightarrowt<sub>x</sub>)\rightarrowt<sub>1</sub>)
returns S = [int/t_x, int/t_3, int/t_1]
2. S_1 = S S_4 S_2 = S S_2 = S [int \rightarrow t_3/t_f]
3. T_1 = S(t_1) = int
```

```
2. Abs T_2 = (int \rightarrow t_3) \rightarrow t_3
                         S_2 = [int \rightarrow t_3/t_f]
                                   \Gamma_3 = [f:t_f]
                          3. App
                                                         \lambda x: t_x
\lambda f: t_f
                                    T_3 = t_3
                                   \S_3 = [ int \rightarrow t_3/t_f ]
         Var f T = t_f Const 5 T = int
```

S = []

$$S_1 = [int/t_x, int/t_3, int/t_1, int \rightarrow int/t_f]$$

$$\Gamma_4 = S_2(\Gamma_1) = []$$

$$T_4 = t_x \rightarrow t_x$$

$$T_4 = t_x \rightarrow t_x$$

$$S_4 = []$$

$$T = t_x$$
$$S = []$$

from Unify $(t_f,int \rightarrow t_3)$

4. Abs



Example: $\lambda f.\lambda x.$ (f (f x))

The Let Construct

- In dynamic semantics, let x = E₁ in E₂ is equivalent to (λx.E₂) E₁
- Typing rule

$$\Gamma \mid - E_1 : \sigma$$
 $\Gamma; x: \sigma \mid - E_2 : \tau$

$$\Gamma \mid - \text{ let } x = E_1 \text{ in } E_2 : \tau$$

- In static semantics let x = E₁ in E₂ is not equivalent to (λx.E₂) E₁
 - In let, the type of "argument" E₁ is inferred/checked before the type of function body E₂
 - let construct enables Hindley Milner style polymorphism!



The Let Construct

Typing rule

$$\Gamma \mid - E_1 : \sigma$$
 $\Gamma; x : \sigma \mid - E_2 : \tau$

$$\Gamma \mid - \text{ let } x = E_1 \text{ in } E_2 : \tau$$

Attribute grammar rule

$$\begin{split} E::= \text{let } \mathbf{x} = \mathbf{E}_1 \text{ in } \mathbf{E}_2 & \Gamma_{E1} = \Gamma_{E} \\ \Gamma_{E2} = \mathbf{S}_{E1}(\Gamma_{E}) + \{\mathbf{x} : T_{E1}\} \\ T_{E} = T_{E2} & \mathbf{S}_{E} = \mathbf{S}_{E2} \, \mathbf{S}_{E1} \end{split}$$

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The Letrec Construct

- letrec $x = E_1$ in E_2
 - x can be referenced from within E₁
 - Extends calculus with general recursion
 - No need to type fix (we can't!) but we can still type recursive functions like plus, times, etc.
 - Haskell's let is a letrec actually...
- E.g.,

letrec plus = $\lambda x.\lambda y$. if (x=0) then y else ((plus x-1) y+1) written as

letrec plus x y = if(x=0) then y else plus (x-1)(y+1)



The Letrec Construct

• letrec $x = E_1$ in E_2

Extensions over let rule

- 1. T_{E1} is inferred in augmented environment $\Gamma_E + \{x:t_x\}$
- 2. Must unify $S_{E1}(t_x)$ and T_{E1}
- 3. Apply substitution S on top of S_{E1} Note: Can merge **let** and **letrec**, in **let Unify** and S have no impact

Attribute grammar rule

$$E ::= letrec x = E_1 in E_2$$

$$\begin{split} &\Gamma_{E1} = \Gamma_E + \{x:t_x\} \\ &S = Unify(S_{E1}(t_x), T_{E1}) \\ &\Gamma_{E2} = S S_{E1}(\Gamma_E) + \{x:T_{E1}\} \\ &T_E = T_{E2} \qquad S_E = S_{E2} S S_{E1} \end{split}$$



let/letrec Examples

letrec plus x y = if(x=0) then y else plus (x-1)(y+1)

Typing plus using Strategy 1...

```
t_{plus} = t_x \rightarrow t_y \rightarrow t_1

t_x = int // because of x=0 and x-1

t_y = int // because of y+1

Unify(t_{plus}, int \rightarrow int \rightarrow int) yields t_1 = int
```

Haskell

```
plus :: int -> int -> int
plus x y = if (x=0) then y else plus (x-1) (y+1)
```

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Algorithm W, Almost There!

```
def W(\Gamma, E) = case E of
                          c -> ([], TypeOf(c))
                                  -> if (x NOT in Dom(□)) then fail
                                        else let T_E = \Gamma(x);
                                                in ([], T_{F})
                          \lambda x.E_1 \rightarrow let(S_{E_1},T_{E_1}) = W(\Gamma + \{x:t_x\},E_1)
                                        in (S_{F1}, S_{F1}(t_x) \rightarrow T_{F1})
                          E_1 E_2 \rightarrow let (S_{E1}, T_{E1}) = W(\Gamma, E_1)
                                             (S_{E2}, T_{E2}) = W(S_{E1}(\Gamma), E_2)
                                             S = Unify(S_{F2}(T_{F1}), T_{F2} \rightarrow t)
                                        in (S S_{E2} S_{E1}, S(t)) // S S_{E2} S_{E1} composes substitutions
                          let x = E_1 in E_2 -> let (S_{E_1}, T_{E_1}) = W(\Gamma, E_1)
                                                          (S_{E2},T_{E2}) = W(S_{E1}(\Gamma)+\{x:T_{E1}\},E_2)
                                                     in (S_{F_2} S_{F_1}, T_{F_2})
```

Algorithm W, Almost There! (merges let and letrec)

```
def W(\Gamma, E) = case E of
                           c -> ([], TypeOf(c))
                                   -> if (x NOT in Dom(Γ)) then fail
                                         else let T_F = \Gamma(x);
                                                  in ([], T_{E})
                           \lambda x.E_1 \rightarrow let (S_{E_1},T_{E_1}) = W(\Gamma + \{x:t_x\},E_1)
                                         in (S_{F1}, S_{F1}(t_x) \rightarrow T_{F1})
                           E_1 E_2 \rightarrow let (S_{E1}, T_{E1}) = W(\Gamma, E_1)
                                              (S_{E_2}, T_{E_2}) = W(S_{E_1}(\Gamma), E_2)
                                              S = Unify(S_{E2}(T_{E1}), T_{E2} \rightarrow t)
                                        in (S S_{F2} S_{F1}, S(t)) // S S_{F2} S_{F1} composes substitutions
                           let x = E_1 in E_2 -> let (S_{E_1}, T_{E_1}) = W(\Gamma + \{x:t_x\}, E_1)
                                                           S = Unify(S_{E1}(t_x), T_{E1})
                                                           (S_{E2},T_{E2}) = W(S S_{E1}(\Gamma)+\{x:T_{E1}\},E_2)
                                                      in (S_{F_2} S_{F_1}, T_{F_2})
```



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- Hindley Milner type inference. Algorithm W