

# TYPE INFERENCE (II)

# SOLVING CONSTRAINTS (RECAP)

- Judgement form:
  - $G \vdash\!\!-\ u \implies e : t, q$
  - $u$  is untyped expression
  - $e : t$  is a term scheme
  - $q$  is a set of constraints
- A **solution** to a system of type constraints is a **substitution  $S$** 
  - a **function** from *type variables* to *type schemes*
  - substitutions are defined on all type variables (a total function), but only some of the variables are actually changed:
    - $S(a) = a$  (for most variables  $a$ )
    - $S(a) = s$  (for some  $a$  and some type scheme  $s$ )
  - $\text{dom}(S) = \text{set of variables s.t. } S(a) \neq a$

# SUBSTITUTIONS

- Given a substitution  $S$ , we can define a function  $S^*$  from type schemes (as opposed to type variables) to type schemes:
  - $S^*(\text{int}) = \text{int}$
  - $S^*(\text{bool}) = \text{bool}$
  - $S^*(s1 \rightarrow s2) = S^*(s1) \rightarrow S^*(s2)$
  - $S^*(a) = S(a)$
- For simplicity, next I will write  $S(s)$  instead of  $S^*(s)$
- $s$  denotes type schemes, whereas  $a, b, c$  denote type variables
- This function **replaces all type variables in a type scheme.**
- There's no variable binding in the language of type scheme, hence no danger of **capturing!**

# EXTENSIONS TO SUBSTITUTION

- Substitution can be extended pointwise to the typing context:

$$G := . \mid G, x : s$$

$$S( . ) = .$$

$$S(G, x:s) = S(G), x: S(s)$$

Similarly, substitution can be applied to the type annotations in an expression, e.g.:

$$S(x) = x$$

$$S(\backslash x:s.e) = \backslash x:S(s).S(e)$$

$$S(\text{nil}[s]) = \text{nil}[S(s)]$$

# COMPOSITION OF SUBSTITUTIONS

- **Composition** ( $U \circ S$ ) applies the substitution  $S$  and then applies the substitution  $U$ :
  - $(U \circ S)(a) = U(S(a))$
- We will need to compare substitutions
  - $T \leq S$  if  $T$  is “more specific” than  $S$
  - $T \leq S$  if  $T$  is “less general” than  $S$
  - Formally:  $T \leq S$  if and only if  $T = U \circ S$  for some  $U$

# COMPOSITION OF SUBSTITUTIONS

## ○ Examples:


- example 1: any substitution is less general than the identity substitution I:
  - $S \leq I$  because  $S = S \circ I$
- example 2:
  - $S(a) = \text{int}, S(b) = c \rightarrow c$
  - $T(a) = \text{int}, T(b) = c \rightarrow c, T(c) = \text{int}$
  - we conclude:  $T \leq S$
  - if  $T(a) = \text{int}, T(b) = \text{int} \rightarrow \text{bool}$  then  $T$  is unrelated to  $S$  (neither more nor less general)

# PRESERVATION OF TYPING UNDER TYPE SUBSTITUTION

- Theorem: If  $S$  is any type substitution and  $G \vdash e : s$ , then  $S(G) \vdash S(e) : S(s)$

Proof: straightforward induction on the typing derivations.

# SOLVING A CONSTRAINT (FIRST ATTEMPT)

- Judgment format:  $S \models q$   
(S is a solution to the constraints q)  


However this will not help you  
Solve q to obtain S!

$$\frac{}{S \models \{ \}}$$

any substitution is  
a solution for the empty  
set of constraints

$$\frac{S(s1) = S(s2) \quad S \models q}{S \models \{s1 = s2\} \cup q}$$

a solution to an equation  
is a substitution that makes  
left and right sides equal



# MOST GENERAL SOLUTIONS

- S is the **principal** (most general) solution of a set of constraints q if
  - $S \models q$  (S is a solution)
  - if  $T \models q$  then  $T \leq S$  (S is the most general one)
- **Lemma:** If q has a solution, then it has a most general one
- We care about principal solutions since they will give us the most general types for terms (polymorphism!)

# EXAMPLES

## ○ Example 1

- $q = \{a=\text{int}, b=a\}$
- principal solution  $S$ :
  - $S(a) = S(b) = \text{int}$
  - $S(c) = c$  (for all  $c$  other than  $a, b$ )

# EXAMPLES

## ○ Example 2

- $q = \{a=\text{int}, b=a, b=\text{bool}\}$
- principal solution S:
  - does not exist (there is no solution to  $q$ )


# PRINCIPAL SOLUTIONS

- principal solutions give rise to most general *reconstruction* of typing information for a term:
  - $\text{fun } f(x:a):a = x$ 
    - is a most general reconstruction
  - $\text{fun } f(x:\text{int}):\text{int} = x$ 
    - is not

# UNIFICATION

- **Unification:** An algorithm that provides the principal solution to a set of constraints (if one exists)
  - If one exists, it will be principal

# UNIFICATION

- **Unification:** Unification systematically simplifies a set of constraints, yielding a substitution
  - During simplification, we maintain  $(S, q)$ 
    - $S$  is the solution so far
    - $q$  are the constraints left to simplify
    - Starting state of unification process:  $(I, q)$
    - Final state of unification process:  $(S, \{\})$
- identity substitution is most general
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# UNIFICATION MACHINE

- We can specify unification as a transition system:
  - $(S, q) \rightarrow (S', q')$
- Base types & simple variables:

----- (u-int)  
 $(S, \{\text{int}=\text{int}\} \cup q) \rightarrow (S, q)$

----- (u-eq)  
 $(S, \{a=a\} \cup q) \rightarrow (S, q)$

----- (u-bool)  
 $(S, \{\text{bool}=\text{bool}\} \cup q) \rightarrow (S, q)$

# UNIFICATION MACHINE

○ Functions: ----- (u-fun)  
 $(S, \{s11 \rightarrow s12 = s21 \rightarrow s22\} \cup q) \rightarrow$   
 $(S, \{s11 = s21, s12 = s22\} \cup q)$

○ Variable definitions

----- (a not in FV(s)) (u-var1)  
 $(S, \{a=s\} \cup q) \rightarrow ([a=s] \circ S, q[s/a])$

----- (a not in FV(s)) (u-var2)  
 $(S, \{s=a\} \cup q) \rightarrow ([a=s] \circ S, q[s/a])$



# OCCURS CHECK

- What is the solution to  $\{a = a \rightarrow a\}$ ?
  - There is none!
  - The occurs check detects this situation

----- (a not in FV(s))  
 $(S, \{a=s\} \cup q) \rightarrow ([a=s] \circ S, q[s/a])$

occurs check



# IRREDUCIBLE STATES

- Recall: final states have the form  $(S, \{ \})$
- Stuck states  $(S, q)$  are such that every equation in  $q$  has the form:
  - $\text{int} = \text{bool}$
  - $s1 \rightarrow s2 = s$  ( $s$  not function type)
  - $a = s$  ( $s$  contains  $a$ )
  - or is symmetric to one of the above
- Stuck states arise when constraints are unsolvable

# TERMINATION

- We want unification to terminate (to give us a type reconstruction **algorithm**)
- In other words, we want to show that there is no infinite sequence of states
  - $(S1, q1) \rightarrow (S2, q2) \rightarrow \dots$
- **Theorem**: unification algorithm always terminates.

# TERMINATION

- We associate an ordering with constraints
  - $q < q'$  if and only if
    - $q$  contains fewer equations than  $q'$
    - $q$  contains the same number of equations but fewer variables than  $q'$
    - $q$  contains the same number of variables as  $q'$  but fewer type constructors (ie: fewer occurrences of `int`, `bool`, or “ $\rightarrow$ ”)
    - in other words,  $q$  is simpler than  $q'$
  - This is a **lexicographic ordering on  $(nq, nv, nc)$** 
    - $nq$ : Number of equations
    - $nv$ : Number of variables
    - $nc$ : Number of constructors
    - There is no infinite decreasing sequence of constraints
  - To prove termination, we must demonstrate that every step of the algorithm reduces the size of  $q$  according to this ordering

# TERMINATION

- Lemma: Every step reduces the size of  $q$ 
  - Proof: By observation on the definition of the reduction relation.

-----  
 $(S, \{\text{int}=\text{int}\} \cup q) \rightarrow (S, q)$

-----  
 $(S, \{s_{11} \rightarrow s_{12} = s_{21} \rightarrow s_{22}\} \cup q) \rightarrow$   
 $(S, \{s_{11} = s_{21}, s_{12} = s_{22}\} \cup q)$

-----  
 $(S, \{\text{bool}=\text{bool}\} \cup q) \rightarrow (S, q)$

----- (a not in FV(s))  
 $(S, \{a=s\} \cup q) \rightarrow$   
 $([a=s] \circ S, q[s/a])$

-----  
 $(S, \{a=a\} \cup q) \rightarrow (S, q)$

----- (a not in FV(s))  
 $(S, \{s=a\} \cup q) \rightarrow$   
 $([a=s] \circ S, q[s/a])$

# CORRECTNESS

- we know the algorithm terminates
- we want to prove that a series of steps:

$(I, q1) \rightarrow (S2, q2) \rightarrow (S3, q3) \rightarrow \dots \rightarrow (S, \{\})$

solves the initial constraints  $q1$


- We'll do that by induction on the length of the unification sequence, but we'll need to define the **invariants** that are preserved from step to step



# COMPLETE SOLUTIONS

- A **complete solution** for  $(S, q)$  is a substitution  $T$  such that
  1.  $T \leq S$
  2.  $T \models q$
  - intuition:  $T$  extends  $S$  and solves  $q$
  
- A **principal solution**  $T$  for  $(S, q)$  is complete for  $(S, q)$  and
  3. for all  $T'$  such that 1. and 2. hold,  $T' \leq T$
  - intuition:  $T$  is the most general solution (it's the least restrictive)

# PROPERTIES OF SOLUTIONS

- Lemma 1: Every final state  $(S, \{\})$  has a complete and principal solution, which is  $S$ . (note: “every” means regardless of the length of unification steps)
- To show that  $S$  is a complete solution:
  - $S \leq S$
  - $S \models \{\}$  
- To show that  $S$  is a principal solution for  $(S, \{\})$ :
  - For any other complete solution  $T$ :
    - $T \leq S$
  - Therefore,  $S$  is the principal solution.
- Proof: by induction on the length of the unification sequence.
  - Case 0 steps:  $S \models \{\}$  is always true for any  $S$ , including  $I$ .  $S \leq I$  for any  $S$ .
  - Hypothesis: for a sequence of  $k$  steps starting from  $(S', q)$ , final state  $(S, \{\})$  has a complete solution  $S$ , i.e.  $S \leq S'$ ,  $S \models q$ .

every substitution is a solution to the empty set of constraints



- Case  $k+1$  steps:
  - There are 6 subcases, one for each unification rule.
  - Cases `int`, `bool`, `fun` and `equal` are trivial since  $S'$  remains the same after the first step, then remaining  $k$  steps is true due to hypothesis.
  - Case `(u-var1)` and `(u-var2)`:
 

if  $([a=s] \circ S, q[s/a])$  has a complete solution  $T$ , i.e.,  
 $T \leq [a=s] \circ S$ , and  $T \models q[s/a]$  (by IH);

then  $(S, \{s=a\} \cup q)$  also has complete solution  $T$ , because  
 $T \leq S$ , and since  $T \leq [a=s] \circ S$ ,  $T \models \{a=s\} \cup q$

(proved)

-----  
 $(S, \{\text{int}=\text{int}\} \cup q) \rightarrow (S, q)$

-----  
 $(S, \{s_{11} \rightarrow s_{12} = s_{21} \rightarrow s_{22}\} \cup q) \rightarrow$   
 $(S, \{s_{11} = s_{21}, s_{12} = s_{22}\} \cup q)$

-----  
 $(S, \{\text{bool}=\text{bool}\} \cup q) \rightarrow (S, q)$

----- (a not in FV(s))  
 $(S, \{a=s\} \cup q) \rightarrow ([a=s] \circ S, q[s/a])$

-----  
 $(S, \{a=a\} \cup q) \rightarrow (S, q)$

----- (a not in FV(s))  
 $(S, \{s=a\} \cup q) \rightarrow ([a=s] \circ S, q[s/a])$

# PROPERTIES OF SOLUTIONS

- Lemma 2: No stuck state has a complete solution (or any solution at all)
  - it is impossible for a substitution to make the necessary equations equal
    - $\text{int} \neq \text{bool}$
    - $\text{int} \neq t1 \rightarrow t2$
    - ...

# PROPERTIES OF SOLUTIONS

## ○ Lemma 3

- If  $(S, q) \rightarrow (S', q')$  then
  - $T$  is complete for  $(S, q)$  iff  $T$  is complete for  $(S', q')$
  - $T$  is principal for  $(S, q)$  iff  $T$  is principal for  $(S', q')$
- Proof: by induction on the derivation of unification step  $\rightarrow$
- In the forward direction, this is the preservation theorem for the unification machine!

## SUMMARY: UNIFICATION

- By termination,  $(I, q) \rightarrow^* (S, q')$  where  $(S, q')$  is irreducible. Moreover:

If  $q' = \{ \}$  then:

- $(S, q')$  is final (by definition)
- $S$  is a principal solution for  $q$ 
  - Consider any  $T$  such that  $T$  is a solution to  $q$ .
  - Now notice,  $S$  is principal for  $(S, q')$  (by lemma 1)
  - $S$  is principal for  $(I, q)$  (by lemma 3)
  - Since  $S$  is principal for  $(I, q)$ , we know  $T \leq S$  and therefore  $S$  is a principal solution for  $q$ .

## SUMMARY: UNIFICATION (CONT.)

- ... Moreover:
  - If  $q'$  is not  $\{\}$  (and  $(I, q) \rightarrow^* (S, q')$  where  $(S, q')$  is irreducible) then:
  - $(S, q')$  is stuck. Consequently,  $(S, q')$  has no complete solution. By lemma 3, even  $(I, q)$  has no complete solution and therefore  $q$  has no solution at all.

# SUMMARY: TYPE INFERENCE

- Type inference algorithm.
  - Given a context  $G$ , and untyped term  $u$ :
    - Find  $e, t, q$  such that  $G \vdash u \Rightarrow e : t, q$
    - Find principal solution  $S$  of  $q$  via unification
      - if no solution exists, there is no reconstruction
    - Apply  $S$  to  $e$ , i.e., our solution is  $S(e)$ 
      - $S(e)$  contains schematic type variables  $a, b, c$ , etc. that may be instantiated with any type
    - Since  $S$  is principal,  $S(e)$  characterizes all reconstructions.

# LET POLYMORPHISM

- Generalized from the type inference algorithm
- A.k.a ML-style or Hindley Milner-style polymorphism
- Basis of “generic libraries”:
  - Trees, lists, arrays, hashtables, streams, ...
- `let id = \x. x in`  
    `(id 25, id true)`
  - `id` can't be both `int → int` and `bool → bool`, due to:

$$\frac{G \vdash e1 : t1 \quad G, x:t1 \vdash e2 : t2}{G \vdash \text{let } x=e1 \text{ in } e2 : t2} \quad [\text{t-let}]$$

# LET POLYMORPHISM

- Instead:

$$\frac{G \vdash e2[e1/x] : t2 \quad G \vdash e1 : t1}{G \vdash \text{let } x=e1 \text{ in } e2 : t2} \quad [\text{t-letPoly}]$$

- Or using the constraint generation rule:

$$\frac{\begin{array}{l} G \dashv\vdash u2[u1/x] ==> e2[e1/x] : t2, q2 \\ G \dashv\vdash u1 ==> e1 : t1, q1 \end{array}}{G \dashv\vdash \text{let } x = u1 \text{ in } u2 ==> \text{let } x = e1 \text{ in } e2 : t2, q1 \cup q2}$$



# CAVEAT WITH LET POLYMORPHISM

- If the body (e2) contains many let bindings
- Every occurrence of a let binding in e2 causes a type check of right-hand-side e1
- e1 itself can contain many let binding as well
- Time complexity **exponential** to the size of the expression!
- Practical implementation uses a smarter but equivalent algorithm:
  - Amortized linear time
  - Worse-case still exponential
  - see Pierce Ch. 22.