

CS 314: Principles of Programming Languages

Type Inference

Polymorphism

The type for map looks like this:

```
map : ('a -> 'b) -> 'a list -> 'b list
```

This type includes an implicit quantifier at the outermost level.
So really, map's type is this one:

```
map : forall 'a, 'b. ('a -> 'b) -> 'a list -> 'b list
```

To use a value with type **forall 'a,'b,'c . t**, we first substitute types for parameters 'a, 'b, c'. eg:

```
map (fun x -> x + 1) [2;3;4]
```



here, we substitute [int/'a][int/'b]
in map's type and then use map at type
(int -> int) -> int list -> int list

Last time: Type Checking

A function `check : context -> exp -> type`

- requires function arguments to be annotated with types
- specified using formal rules. eg, the rule for function call:

```
let f =  
  fun (x:int) -> x + 1 in  
f 10
```

$$\frac{G \vdash e1 : t1 \rightarrow t2 \quad G \vdash e2 : t1}{G \vdash e1 \ e2 : t2}$$

Type Schemes

A *type scheme* contains type variables that may be filled in during type inference

$$s ::= a \mid \text{int} \mid \text{bool} \mid s \rightarrow s$$

A *term scheme* is a term that contains type schemes rather than proper types. eg, for functions:

$$\text{fun } (x:s) \rightarrow e$$
$$\text{let rec } f (x:s) : s = e$$

Main Algorithm

- ▶ Add distinct variables in all places type schemes are needed
- ▶ Generate constraint (equations between types) that must be satisfied in order for an expression to type check
- ▶ Solve the equations, generating substitutions of types for the variables.

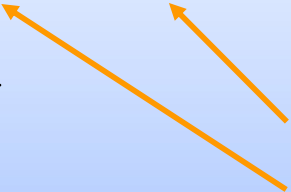
Example: Inferring types for map

```
let rec map f l =  
  match l with  
    [] -> []  
  | hd::tl -> f hd :: map f tl
```

Step 1: Annotate

constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | hd::tl -> f hd :: map f tl
```



type schemes
on functions

Step 2: Generate Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | (hd:b') :: (tl:b' list) ->  
    f hd :: map f tl
```

b = b' list



constraints
b = b' list

Step 2: Generate Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | (hd:b') :: (tl:b' list) ->  
    f hd :: map f tl
```

b = b' list

constraints
b = b' list
a = a
b = b' list

a = a b = b' list

Step 2: Generate Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
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  | (hd:b') :: (tl:b' list) ->  
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```

b = b' list

constraints
b = b' list
a = a
b = b' list
a = b' -> a'

a = b' -> a'

a = a b = b' list

Step 2: Generate Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | (hd:b') :: (tl:b' list) ->  
    ((f (hd:b')) :a' :: (map f tl) :c) :c' list
```

b = b' list

constraints
b = b' list
a = a
b = b' list
a = b' -> a'
c = c' list
a' = c'

a = b' -> a'

a = a b = b' list

c = c' list
a' = c'

Step 2: Generate Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
  [] -> [] :d list  
  | (hd:b') :: (tl:b' list) ->  
    ((f (hd:b')) :a' :: (map f tl):c) :c' list
```

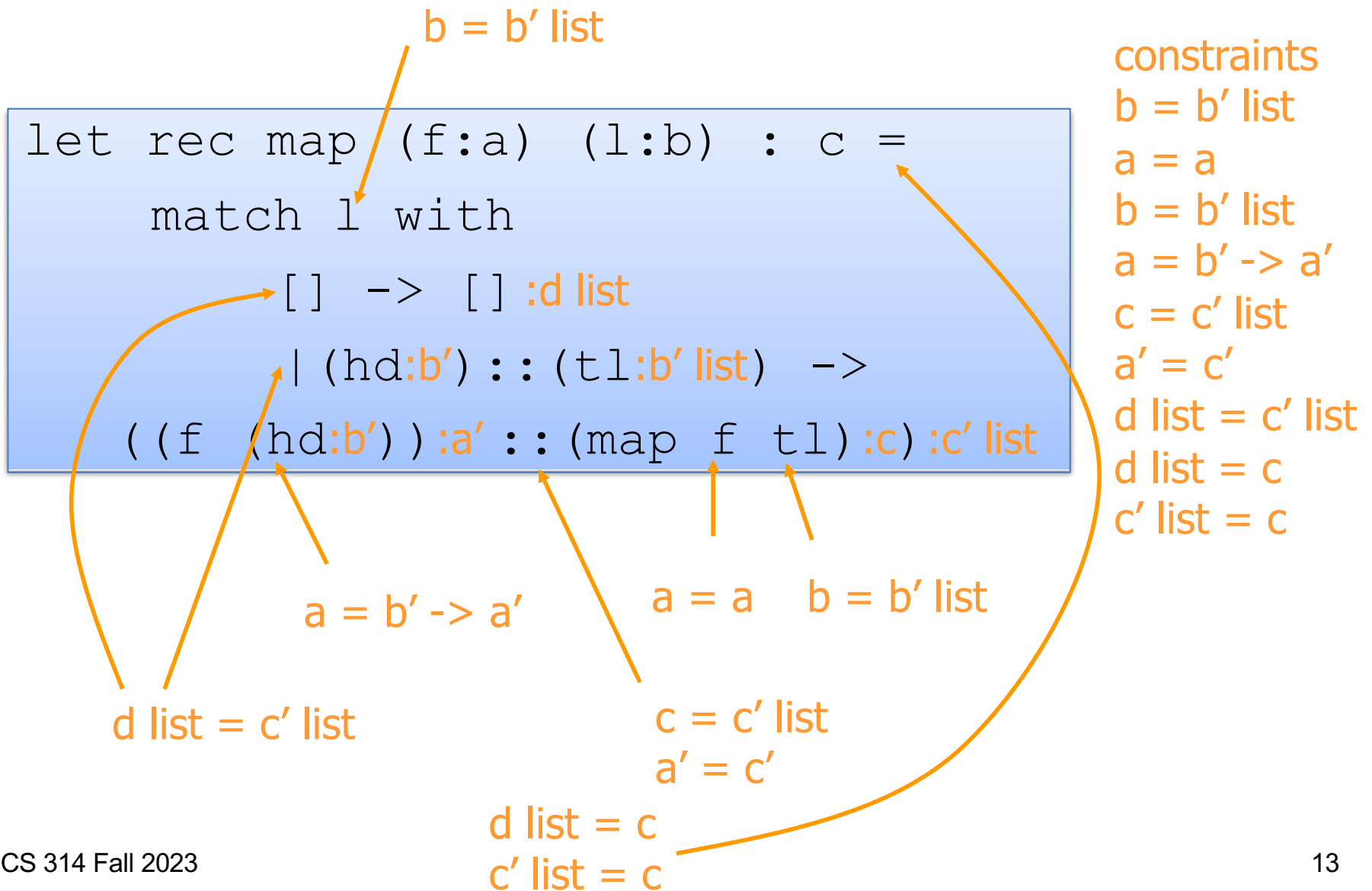
Annotations:

- $b = b' \text{ list}$ (points to `l:b`)
- $a = b' \rightarrow a'$ (points to `hd:b'`)
- $d \text{ list} = c' \text{ list}$ (points to `[] :d list`)
- $a = a$ (points to `f (hd:b')`)
- $b = b' \text{ list}$ (points to `tl:b' list`)
- $c = c' \text{ list}$ (points to `map f tl:c`)
- $a' = c'$ (points to `:a' ::`)

constraints

- $b = b' \text{ list}$
- $a = a$
- $b = b' \text{ list}$
- $a = b' \rightarrow a'$
- $c = c' \text{ list}$
- $a' = c'$
- $d \text{ list} = c' \text{ list}$

Step 2: Generate Constraints



Step 3: Solve Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | hd::tl -> f hd :: map f tl
```

constraints

$b = b' \text{ list}$

$a = a$

$b = b' \text{ list}$

$a = b' \rightarrow a'$

$c = c' \text{ list}$

$a' = c'$

$d \text{ list} = c' \text{ list}$

$d \text{ list} = c$

$c' \text{ list} = c$



solution

$[b' \rightarrow c'/a]$

$[b' \text{ list}/b]$

$[c' \text{ list}/c]$

Step 3: Solve Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | hd::tl -> f hd :: map f tl
```

final solution:

```
[b' -> c'/a]  
[b' list/b]  
[c' list/c]
```

```
let rec map (f:b' -> c') (l:b' list) : c' list =  
  match l with  
    [] -> []  
  | hd::tl -> f hd :: map f tl
```

Type Inference Details

- ▶ Type constraints are sets of equations between type schemes
 - $q ::= \{s_{11} = s_{12}, \dots, s_{n1} = s_{n2}\}$
 - e.g.: $\{b = b' \text{ list}, a = (b \rightarrow c)\}$

Constraint Generation

- ▶ Syntax-directed constraint generation
 - our algorithm crawls over abstract syntax of untyped expressions and generates
 - a term scheme
 - a set of constraints

Constraint Generation

- ▶ Algorithm defined as set of inference rules:

$$\bullet \text{ } G \vdash u \Rightarrow e : t, q$$

constraints that must be solved

annotated
expression

unannotated
expression

inputs

outputs

in OCaml:

```
gen : ctxt -> exp ->  
      ann_exp * scheme * constraints
```

Constraint Generation

► Simple rules:

- $G \vdash x \implies x : s, \{ \}$ (if $G(x) = s$)
- $G \vdash n \implies n : \text{int}, \{ \}$
- $G \vdash \text{true} \implies \text{true} : \text{bool}, \{ \}$
- $G \vdash \text{false} \implies \text{false} : \text{bool}, \{ \}$

Operators

$$\begin{array}{c} G \vdash u1 ==> e1 : t1, q1 \qquad G \vdash u2 ==> e2 : t2, q2 \\ \hline G \vdash u1 + u2 ==> e1 + e2 : \text{int}, q1 \cup q2 \cup \{t1 = \text{int}, t2 = \text{int}\} \end{array}$$
$$\begin{array}{c} G \vdash u1 ==> e1 : t1, q1 \qquad G \vdash u2 ==> e2 : t2, q2 \\ \hline G \vdash u1 < u2 ==> e1 < e2 : \text{bool}, q1 \cup q2 \cup \{t1 = \text{int}, t2 = \text{int}\} \end{array}$$

If Expressions

$G \vdash u1 ==> e1 : t1, q1$

$G \vdash u2 ==> e2 : t2, q2$

$G \vdash u3 ==> e3 : t3, q3$

-----.

$G \vdash \text{if } u1 \text{ then } u2 \text{ else } u3 ==> \text{if } e1 \text{ then } e2 \text{ else } e3$

$: t2, \quad q1 \cup q2 \cup q3 \cup \{t1=\text{bool}, t2 = t3\}$

Function Application

$$\frac{\begin{array}{l} G \vdash u1 ==> e1 : t1, q1 \\ G \vdash u2 ==> e2 : t2, q2 \end{array} \quad \text{(for fresh } a\text{)}}{G \vdash u1 \ u2 ==> e1 \ e2 \quad : \quad a, \quad q1 \ U \ q2 \ U \ \{t1 = t2 \rightarrow a\}}$$

Example

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | (hd:b') :: (tl:b' list) ->  
    (f (hd:b')) :a' :: map f tl
```

b = b' list

a = b' -> a'

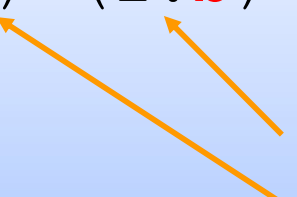
Function Definition

$$\frac{G, x : a \vdash u \Rightarrow e : t, q \quad \text{(for fresh } a, b)}{G \vdash (\text{fun } x \rightarrow u) \Rightarrow (\text{fun } (x : a) : b \rightarrow e) : a \rightarrow b, q \cup \{t = b\}}$$

Example

```
let rec map (f:a) (l:b) : c =  
  match l with  
    [] -> []  
  | hd::tl -> f hd :: map f tl
```

type schemes
on functions



Step 2: Generate Constraints

```
let rec map (f:a) (l:b) : c =  
  match l with  
  [] -> [] :d list  
  | (hd:b') :: (tl:b' list) ->  
    ((f (hd:b')) :a' :: (map f tl):c) :c' list
```

$b = b' \text{ list}$

$d \text{ list} = c' \text{ list}$

$d \text{ list} = c$
 $c' \text{ list} = c$

Function Definition

$$\frac{G, f : a \rightarrow b, x : a \vdash u \Rightarrow e : t, q \quad (\text{for fresh } a, b)}{G \vdash (\text{rec } f(x) = u) \Rightarrow (\text{rec } f (x : a) : b = e) : a \rightarrow b, q \cup \{t = b\}}$$

Summary: The type inference system

$$\frac{G \vdash u1 ==> e1 : t1, q1 \quad G \vdash u2 ==> e2 : t2, q2}{G \vdash u1 + u2 ==> e1 + e2 : \text{int}, q1 \cup q2 \cup \{t1 = \text{int}, t2 = \text{int}\}}$$

$$\frac{G \vdash u1 ==> e1 : t1, q1 \quad G \vdash u2 ==> e2 : t2, q2 \quad G \vdash u3 ==> e3 : t3, q3}{G \vdash \text{if } u1 \text{ then } u2 \text{ else } u3 ==> \text{if } e1 \text{ then } e2 \text{ else } e3 : t2, q1 \cup q2 \cup q3 \cup \{t1 = \text{bool}, t2 = t3\}}$$

$$G \vdash x ==> x : s, \{ \} \quad (\text{if } G(x) = s)$$

$$G \vdash n ==> n : \text{int}, \{ \}$$

$$\frac{G \vdash u1 ==> e1 : t1, q1 \quad G \vdash u2 ==> e2 : t2, q2 \quad (\text{for fresh } a)}{G \vdash u1 \ u2 ==> e1 \ e2 : a, q1 \cup q2 \cup \{t1 = t2 \rightarrow a\}}$$

$$\frac{G, x : a \vdash u ==> e : t, q \quad (\text{for fresh } a)}{G \vdash \text{fun } x \rightarrow u ==> \text{fun } (x : a) \rightarrow e : a \rightarrow t, q}$$

$$\frac{G, f : a \rightarrow b, x : a \vdash u ==> e : t, q \quad (\text{for fresh } a, b)}{G \vdash \text{rec } f(x) = u ==> \text{rec } f(x : a) : b = e : a \rightarrow b, q \cup \{t = b\}}$$

Solving Constraints

- ▶ A solution to a system of type constraints is a ***substitution S***
 - a function from type variables to types
 - assume substitutions are defined on all type variables:
 - $S(a) = a$ (for almost all variables a)
 - $S(a) = s$ (for some type scheme s)

We can also apply a substitution S to a full type scheme s .

apply: [int/a , $\text{int} \rightarrow \text{bool}/b$]

to: $b \rightarrow a \rightarrow b$

returns: $(\text{int} \rightarrow \text{bool}) \rightarrow \text{int} \rightarrow (\text{int} \rightarrow \text{bool})$

Substitutions

- ▶ When is a substitution S a solution to a set of constraints?
- ▶ Constraints: $\{ s1 = s2, s3 = s4, s5 = s6, \dots \}$
- ▶ When the substitution makes both sides of all equations the same.

constraints:

```
a = b -> c  
c = int -> bool
```

solution:

```
b -> (int -> bool)/a  
int -> bool/c  
b/b
```

Substitutions

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constraints:

```
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c = int -> bool
```

solution:

```
b -> (int -> bool)/a
int -> bool/c
b/b
```

constraints with solution applied:

```
b -> (int -> bool)    =    b -> (int -> bool)
    int -> bool      =    int -> bool
```

Substitutions

- ▶ When is a substitution S a solution to a set of constraints?
- ▶ Constraints: $\{ s1 = s2, s3 = s4, s5 = s6, \dots \}$
- ▶ When the substitution makes both sides of all equations the same.

constraints:

```
a = b -> c  
c = int -> bool
```

solution:

```
b -> (int -> bool)/a  
int -> bool/c  
b/b
```

solution 2:

```
int->(int->bool) / a  
int->bool / c  
int / b
```


Substitutions

- ▶ When is one solution better than another to a set of constraints?

constraints:

```
a = b -> c  
c = int -> bool
```

solution 1:

```
b -> (int -> bool) / a  
int -> bool / c  
b / b
```

type $b \rightarrow c$ with solution applied:

```
b -> (int -> bool)
```

solution 2:

```
int -> (int -> bool) / a  
int -> bool / c  
int / b
```

type $b \rightarrow c$ with solution applied:

```
int -> (int -> bool)
```

Substitutions

solution 1:

```
b -> (int -> bool) / a  
int -> bool / c  
b / b
```

type $b \rightarrow c$ with solution applied:

```
b -> (int -> bool)
```

solution 2:

```
int -> (int -> bool) / a  
int -> bool / c  
int / b
```

type $b \rightarrow c$ with solution applied:

```
int -> (int -> bool)
```

Solution 1 is "more general" – there is more flex.

Solution 2 is "more concrete"

We prefer solution 1.

Substitutions

solution 1:

```
b->(int->bool) / a  
int->bool / c  
b / b
```

type $b \rightarrow c$ with solution applied:

```
b -> (int -> bool)
```

solution 2:

```
int->(int->bool) / a  
int->bool / c  
int / b
```

type $b \rightarrow c$ with solution applied:

```
int -> (int -> bool)
```

Solution 1 is "more general" – there is more flex.

Solution 2 is "more concrete"

We prefer the more general (less concrete) solution 1.

Technically, we prefer T to S if there exists another substitution U and for all types t , $S(t) = U(T(t))$

Substitutions

solution 1:

```
b -> (int -> bool) / a  
int -> bool / c  
b / b
```

type $b \rightarrow c$ with solution applied:

```
b -> (int -> bool)
```

solution 2:

```
int -> (int -> bool) / a  
int -> bool / c  
int / b
```

type $b \rightarrow c$ with solution applied:

```
int -> (int -> bool)
```

There is always a *best* solution, which we can call a *principal solution*.
The best solution is (at least as) preferred as any other solution.

Examples

Example 1

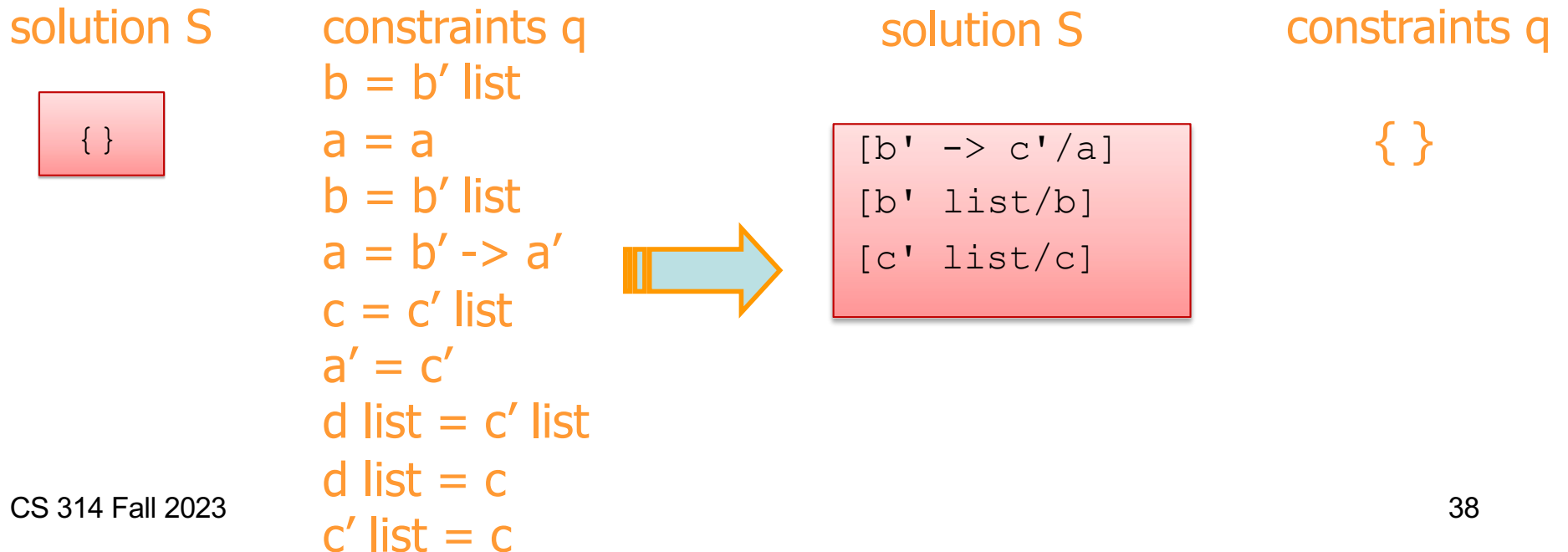
- $q = \{a=\text{int}, b=a\}$
- principal solution S :
 - $S(a) = S(b) = \text{int}$
 - $S(c) = c$ (for all c other than a, b)

Example 2

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

Unification

- ▶ **Unification**: An algorithm that provides the **principal solution** to a set of constraints (if one exists)
 - Unification systematically simplifies a set of constraints, yielding a substitution
 - Starting state of unification process: $(\{\}, q)$
 - Final state of unification process: $(S, \{\})$



Unification

- Unification simplifies equations step-by-step until
 - there are no equations left to simplify, or
 - we find basic equations are inconsistent and we fail

```
unify : substitution -> constraints  
      -> substitution
```

```
let rec unify S q =  
  match q with  
  | { } -> S  
  | {bool=bool} U q' -> unify q'  
  | {int = int} U q' -> unify q'
```

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  match q with  
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  | {int = int} U q' -> unify q'  
  | {a = a} U q' -> unify q'
```


Unification

- Unification simplifies equations step-by-step until
 - there are no equations left to simplify, or
 - we find basic equations are inconsistent and we fail

unify : substitution \rightarrow constraints
 \rightarrow substitution

```
let rec unify S q =  
  match q with  
  | ...  
  | {A  $\rightarrow$  B = C  $\rightarrow$  D} U q'  $\rightarrow$   
    unify S ({A = C, B = D} U q')
```

Unification

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Unification

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 - there are no equations left to simplify, or
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unify : substitution \rightarrow constraints
 \rightarrow substitution

```
let rec unify S q =  
  match q with  
  | ...  
  | {a=s} U q' ->  
    unify ([s/a] U S) q'
```

??

Unification

Ideal solution :

int / p
int / q
int / r

$\text{unify } \{\} \{ (p \rightarrow p \rightarrow q = q \rightarrow r \rightarrow \text{int}) \}$

$\text{unify } \{\} \{ (p = q), (p = r), (q = \text{int}) \}$

$\text{unify } \{ [q/p] \} \{ (p = r), (q = \text{int}) \}$

$\text{unify } \{ [q/p], [r/p] \} \{ (q = \text{int}) \}$

$\text{unify } \{ [q/p], [r/p], [\text{int}/q] \} \{ \}$

Unification

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unify : substitution \rightarrow constraints
 \rightarrow substitution

```
let rec unify S q =  
  match q with  
  | ...  
  | {a=s} U q' ->  
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```

Unification

- Unification simplifies equations step-by-step until
 - there are no equations left to simplify, or
 - we find basic equations are inconsistent and we fail

unify : substitution \rightarrow constraints
 \rightarrow substitution

```
let rec unify S q = Any occurrence of type variable
  match q with      a in types within S and q must
  | ...             be replaced by s
  | {a=s} U q' ->
    unify ([s/a] U [s/a]S) [s/a]q'
```

Unification

let rec unify S q = match q with

| {a=s} U q' -> unify ([s/a] ∪ [s/a]S) [s/a]q'

unify {} { (p → p → q = q → r → int) }

unify {} { (p = q) , (p = r) , (q = int) }

Ideal solution :

int / p
int / q
int / r

Unification

let rec unify S q = match q with

| {a=s} U q' -> unify ([s/a] ∪ [s/a]S) [s/a]q'

unify {} { (p → p → q = q → r → int) }

unify {} { (p = q) , (p = r) , (q = int) }

unify { [q/p] } { (q = r) , (q = int) }

Ideal solution :

int / p
int / q
int / r

Unification

let rec unify S q = match q with

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unify {} { (p = q) , (p = r) , (q = int) }

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Ideal solution :

int / p
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int / r

Unification

let rec unify S q = match q with

| {a=s} U q' -> unify ([s/a] U [s/a]S) [s/a]q'

unify {} { (p → p → q = q → r → int) }

unify {} { (p = q) , (p = r) , (q = int) }

unify { [q/p] } { (q = r) , (q = int) }

unify { [r/p] , [r/q] } { (r = int) }

Ideal solution :

int / p
int / q
int / r

Unification

let rec unify S q = match q with

| {a=s} U q' -> unify ([s/a] U [s/a]S) [s/a]q'

unify {} { (p → p → q = q → r → int) }

unify {} { (p = q) , (p = r) , (q = int) }

unify { [q/p] } { (q = r) , (q = int) }

unify { [r/p] , [r/q] } { (r = int) }

Ideal solution :

int / p
int / q
int / r

Unification

let rec unify S q = match q with

| {a=s} U q' -> unify ([s/a] U [s/a]S) [s/a]q'

unify {} { (p → p → q = q → r → int) }

unify {} { (p = q) , (p = r) , (q = int) }

unify { [q/p] } { (q = r) , (q = int) }

unify { [r/p] , [r/q] } { (r = int) }

unify { [int/p] , [int/p] , [int/r] } {}

Ideal solution :

int / p
int / q
int / r

Unification

- Unification simplifies equations step-by-step until
 - there are no equations left to simplify, or
 - we find basic equations are inconsistent and we fail

unify : substitution \rightarrow constraints
 \rightarrow substitution

```
let rec unify S q =  
  match q with  
  | ...  
  | {a=s} U q' ->  
    unify ([s/a]  $\cup$  [s/a]S) [s/a]q'
```

Occurs Check

$$\frac{\begin{array}{l} G \vdash u1 ==> e1 : t1, q1 \\ G \vdash u2 ==> e2 : t2, q2 \end{array} \quad \text{(for fresh a)}}{G \vdash u1 u2 ==> e1 e2 : a, q1 \cup q2 \cup \{t1 = t2 \rightarrow a\}}$$

► Consider a program:

- `fun x -> x x`

```
# fun x -> x x ;;
```

Line 1, characters 11-12:

Error: This expression has type 'a -> 'b but an expression was expected of type 'a
The type variable 'a occurs inside 'a -> 'b

- `fun (x:'a) -> ((x x):'b)`

Occurs Check

$$\frac{\begin{array}{l} G \vdash u1 ==> e1 : t1, q1 \\ G \vdash u2 ==> e2 : t2, q2 \end{array} \quad \text{(for fresh } a\text{)}}{G \vdash u1 u2 ==> e1 e2 : a, q1 \cup q2 \cup \{t1 = t2 \rightarrow a\}}$$

► Consider a program:

- `fun x -> x x`

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# fun x -> x x ;;
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Line 1, characters 11-12:

Error: This expression has type 'a -> 'b but an expression was expected of type 'a
The type variable 'a occurs inside 'a -> 'b

- `fun (x:'a) -> ((x x):'b)`

- It generates the constraints: `'a = 'a > 'b`
- What is the solution to `{'a = 'a > 'b}`?

Occurs Check

- ▶ Consider a program:
 - `fun x -> x x`
- ▶ It generates the constraints: `'a = 'a > 'b`
- ▶ What is the solution to `{'a = 'a > 'b}`?
- ▶ There is none!

For a constraint `{a = s}`, whenever `a` appears in `TypeVars(s)` and `s` is not just `a`, there is no solution to the system of constraints.

Occurs Check

- ▶ Consider a program:
 - `fun x -> x x`
- ▶ It generates the constraints: `'a = 'a > 'b`
- ▶ What is the solution to `{'a = 'a > 'b}`?
- ▶ There is none!

`"when a is not in TypeVars(s)"` is known as the `"occurs check"`

Unification

- Unification simplifies equations step-by-step until
 - there are no equations left to simplify, or
 - we find basic equations are inconsistent and we fail

unify : substitution \rightarrow constraints
 \rightarrow substitution

```
let rec unify S q =  
  match q with  
  | ...  
  | {a=s} U q' ->  
    unify ([s/a]  $\cup$  [s/a]S) [s/a]q'  
  when a is not in TypeVars(s)
```

Summary: Unification Engine

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

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

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

$$(S, \{A \rightarrow B = C \rightarrow D\} \cup q) \rightarrow (S, \{A = C\} \cup \{B = D\} \cup q)$$

$$(S, \{a=s\} \cup q) \rightarrow ([s/a] \cup [s/a]S, [s/a]q) \quad \text{when } a \text{ is not in TypeVars}(s)$$