

# Type Checking

## Part 3: Type Inference (Simple Types)

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# Robin Milner: Turing Award Winner 1991



Robin Milner

For three distinct and complete achievements:

1. LCF, the mechanization of Scott's Logic of Computable Functions, probably the first theoretically based yet practical tool for machine assisted proof construction;
2. ML, the first language to include polymorphic type inference together with a type-safe exception-handling mechanism;
3. CCS, a general theory of concurrency.

In addition, he formulated and strongly advanced full abstraction, the study of the relationship between operational and denotational semantics.

We will be studying Hindley-Milner type inference.  
Discovered by Hindley, rediscovered by Milner. Formalized by Damas.  
Broken several times when effects were added to ML.



# Language Design for Type Inference

The ML language and type system is designed to support a very strong form of type inference.

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

It's very convenient we don't have to annotate  $f$  and  $l$  with their types, as is required by our type checking algorithm.



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```
map : ('a -> 'b) -> 'a list -> 'b list
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ML finds this type for map:

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

which is really an abbreviation for this type:

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



# Language Design for Type Inference

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

We call this type the *principal type (scheme)* for map.

Any other ML-style type you can give map is *an instance* of this type, meaning we can obtain the other types via *substitution* of types for parameters from the principle type.

E.g.:

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

```
('a -> int) -> 'a list -> int list
```

```
('a -> 'a) -> 'a list -> 'a list
```



# Language Design for Type Inference

Principal types are great:

- the type inference engine can make a *best choice* for the type to give an expression
- the engine doesn't have to guess (and won't have to guess wrong)

The fact that principal types exist is surprisingly brittle. If you change ML's type system a little bit in either direction, it can fall apart.



# Language Design for Type Inference

Suppose we take out polymorphic types and need a type for `id`:

```
let id x = x
```

Then the compiler might guess that `id` has one (and only one) of these types:

```
id : bool -> bool
```

```
id : int -> int
```





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Then the compiler might guess that `id` has one (and only one) of these types:

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```

```
id : int -> int
```

But later on, one of the following code snippets won't type check:

```
id true
```

```
id 3
```

So whatever choice is made, a different one might have been better.



# Language Design for Type Inference

We showed that removing types from the language causes a failure of principal types.

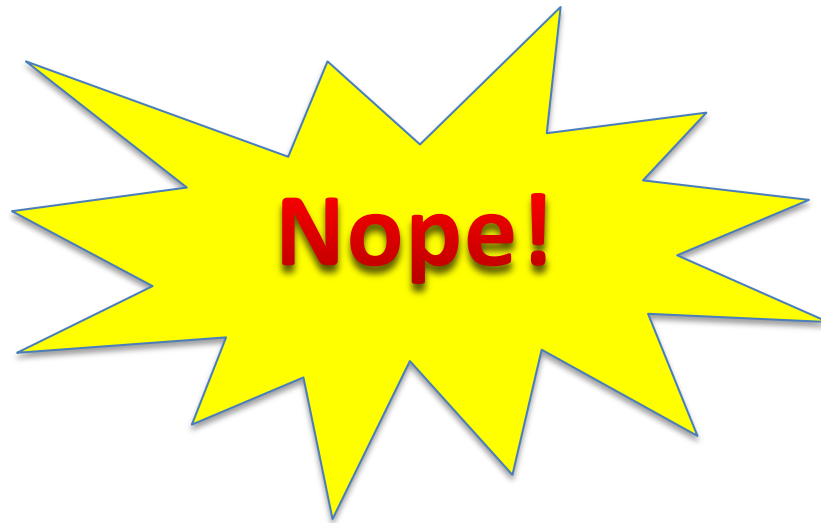
Does adding more types always make type inference easier?



# Language Design for Type Inference

We showed that removing types from the language causes a failure of principle types.

Does adding more types always make type inference easier?



# Language Design for Type Inference

OCaml has universal types on the outside (“prenex quantification”):

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

It does not have types like this:

```
( forall 'a.'a -> int ) -> int -> bool
```

argument type has its own polymorphic quantifier



# Language Design for Type Inference

Consider this program:

```
let f g = (g true, g 3)
```

notice that parameter *g* is used inside *f* as if:

- 1. its argument can have type bool, *AND*
- 2. its argument can have type int



# Language Design for Type Inference

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notice that parameter  $g$  is used inside  $f$  as if:

- 1. its argument can have type `bool`, **AND**
- 2. its argument can have type `int`

Does the following type work?

```
f: ('a -> int) -> int * int
```



# Language Design for Type Inference

Consider this program:

```
let f g = (g true, g 3)
```

notice that parameter  $g$  is used inside  $f$  as if:

1. its argument can have type `bool`, **AND**
2. its argument can have type `int`

Does the following type work?

```
f: ('a -> int) -> int * int
```

**NO:** this says  $g$ 's argument can be any type `'a` (it could be `int` or `bool`)

**Consider**  $g$  is `(fun x -> x + 2) : int -> int`.

Unfortunately,  $f\ g$  goes wrong when  $g$  applied to `true` inside  $f$ .



# Language Design for Type Inference

Consider this program again:

```
let f g = (g true, g 3)
```

We might want to give it this type:

```
f : (forall a.a->a) -> bool * int
```

Notice that the universal quantifier appears left of ->





# Language Design for Type Inference

**System F** is a lot like OCaml, except that it allows universal quantifiers in any position. It could type check f.

```
let f g = (g true, g 3)
```

```
f : (forall a.a->a) -> bool * int
```

Unfortunately, type inference in System F is undecidable.



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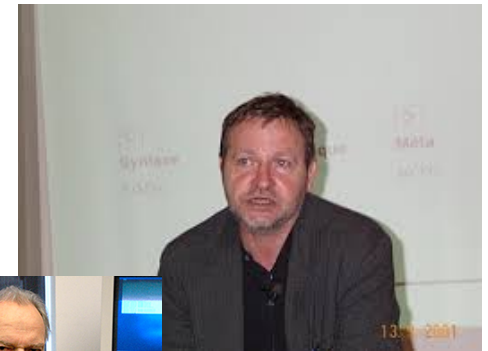
```
let f g = (g true, g 3)
```

```
f : (forall a.a->a) -> bool * int
```

Unfortunately, type inference in System F is undecidable.

Developed in 1972 by logician Jean Yves-Girard who was interested in the consistency of a logic of 2<sup>nd</sup>-order arithmetic.

Rediscovered as programming language by John Reynolds in 1974.



John C. Reynolds (John Barna photo)



# Language Design for Type Inference

Even seemingly small changes can effect type inference.

Suppose "+" operated on both floats and ints. What type for this?

```
let f x = x + x
```



# Language Design for Type Inference

Even seemingly small changes can effect type inference.

Suppose "+" operated on both floats and ints. What type for this?

```
let f x = x + x
```

```
f : int -> int ?
```

```
f : float -> float ?
```



# Language Design for Type Inference

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Suppose "+" operated on both floats and ints. What type for this?

```
let f x = x + x
```

```
f : int -> int ?
```

```
f : float -> float ?
```

```
f : 'a -> 'a ?
```



# Language Design for Type Inference

Even seemingly small changes can effect type inference.

Suppose "+" operated on both floats and ints. What type for this?

```
let f x = x + x
```

```
f : int -> int ?
```

```
f : float -> float ?
```

```
f : 'a -> 'a ?
```

No type in OCaml's type system works. In Haskell:

```
f : Num 'a => 'a -> 'a
```



# THE TYPE INFERENCE ALGORITHM



# 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:

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




# Two Algorithms for Inferring Types

## Algorithm 1:

- Declarative; generates constraints to be solved later
- Easier to understand
- Easier to prove correct
- Less efficient, not used in practice

## Algorithm 2:

- Imperative; solves constraints and updates as-you-go
- Harder to understand
- Harder to prove correct
- More efficient, used in practice
- See: <http://okmij.org/ftp/ML/generalization.html>



# Algorithm 1

- 1) Add distinct variables in all places type schemes are needed
- 2) Generate constraints (equations between types) that must be satisfied in order for an expression to type check
  - Notice the difference between this and the type checking algorithm from last time. Last time, we tried to:
    - eagerly deduce the concrete type when checking every expression
    - reject programs when types didn't match. eg:

$f\ e$  --  $f$ 's argument type must equal  $e$

- This time, we'll collect up equations like:

$(a \rightarrow b) = c$

- 3) Solve the equations, generating substitutions of types for variables or finding that the equations can't be solved



## Example: Inferring types for map

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



# Step 1: Annotate

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



## Step 2: Generate Constraints

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

```
b = d list  
a = d -> e  
...
```



## Step 2: Generate Constraints

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

final constraints:

```
b = b' list  
b = b'' list  
b = b''' list  
a = a  
b = b''' list  
a = b'' -> a'  
c = c' list  
a' = c'  
d list = c' list  
d 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 constraints:

```
b = b' list  
b = b'' list  
b = b''' list  
a = a  
b = b'''' list  
a = b'' -> a'  
c = c' list  
a' = c'  
d list = c' list  
d list = c
```

final solution:

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





## Step 3: Solve Constraints

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

renaming type variables:

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



# CONSTRAINT GENERATION



# Type Inference Details

Type constraints are sets of equations between type schemes

–  $q ::= \{s_{11} = s_{12}, \dots, s_{n1} = s_{n2}\}$

– e.g.:  $\{b = b' \text{ list}, a = (b \rightarrow c)\}$



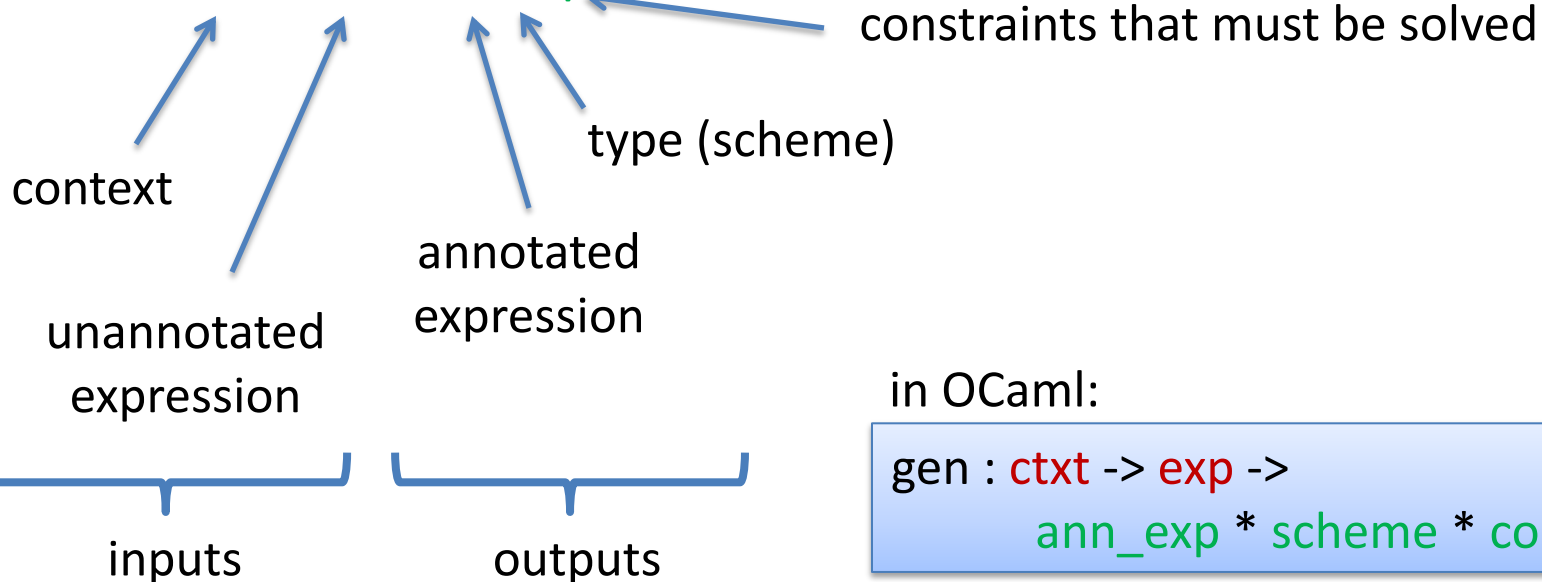
# Constraint Generation

## Syntax-directed constraint generation

- our algorithm crawls over abstract syntax of untyped expressions and generates
  - a term scheme
  - a set of constraints

Algorithm defined as set of inference rules:

$- G \vdash u \Rightarrow e : t, q$



in OCaml:

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



# Constraint Generation

Simple rules:

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


# Operators

$$\frac{G \vdash u_1 \Rightarrow e_1 : t_1, q_1 \quad G \vdash u_2 \Rightarrow e_2 : t_2, q_2}{G \vdash u_1 + u_2 \Rightarrow e_1 + e_2 : \text{int}, q_1 \cup q_2 \cup \{t_1 = \text{int}, t_2 = \text{int}\}}$$
$$\frac{G \vdash u_1 \Rightarrow e_1 : t_1, q_1 \quad G \vdash u_2 \Rightarrow e_2 : t_2, q_2}{G \vdash u_1 < u_2 \Rightarrow e_1 < e_2 : \text{bool}, q_1 \cup q_2 \cup \{t_1 = \text{int}, t_2 = \text{int}\}}$$


# If statements

$G \vdash u1 \implies e1 : t1, q1$

$G \vdash u2 \implies e2 : t2, q2$

$G \vdash u3 \implies e3 : t3, q3$

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

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



# Function Application

$$\begin{array}{l} G \vdash u_1 \Rightarrow e_1 : t_1, q_1 \\ G \vdash u_2 \Rightarrow e_2 : t_2, q_2 \quad (\text{for fresh } a) \\ \hline G \vdash u_1 u_2 \Rightarrow e_1 e_2 \quad : \quad a, \quad q_1 \cup q_2 \cup \{t_1 = t_2 \rightarrow a\} \end{array}$$




# Function Declaration

$$G, x : a \vdash u \Rightarrow e : t, q \quad (\text{for fresh } a)$$

---

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

---

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


# Summary: The Type Inference System

$$\frac{G \vdash u_1 \Rightarrow e_1 : t_1, q_1 \quad G \vdash u_2 \Rightarrow e_2 : t_2, q_2}{G \vdash u_1 + u_2 \Rightarrow e_1 + e_2 : \text{int}, q_1 \cup q_2 \cup \{t_1 = \text{int}, t_2 = \text{int}\}}$$
$$\frac{G \vdash u_1 \Rightarrow e_1 : t_1, q_1 \quad G \vdash u_2 \Rightarrow e_2 : t_2, q_2 \quad G \vdash u_3 \Rightarrow e_3 : t_3, q_3}{G \vdash \text{if } u_1 \text{ then } u_2 \text{ else } u_3 \Rightarrow \text{if } e_1 \text{ then } e_2 \text{ else } e_3 : t_2, q_1 \cup q_2 \cup q_3 \cup \{t_1 = \text{bool}, t_2 = t_3\}}$$
$$\frac{G \vdash u_1 \Rightarrow e_1 : t_1, q_1 \quad G \vdash u_2 \Rightarrow e_2 : t_2, q_2 \quad (\text{for fresh } a)}{G \vdash u_1 u_2 \Rightarrow e_1 e_2 : a, q_1 \cup q_2 \cup \{t_1 = t_2 \rightarrow a\}}$$
$$\frac{G, x : a \vdash u \Rightarrow e : t, q \quad (\text{for fresh } a)}{G \vdash \text{fun } x \rightarrow u \Rightarrow \text{fun } (x : a) \rightarrow e : a \rightarrow t, q}$$
$$\frac{G, f : a \rightarrow b, x : a \vdash u \Rightarrow e : t, q \quad (\text{for fresh } a, b)}{G \vdash \text{rec } f(x) = u \Rightarrow \text{rec } f(x : a) : b = e : a \rightarrow b, q \cup \{t = b\}}$$
$$G \vdash x \Rightarrow x : s, \{ \} \quad (\text{if } G(x) = s)$$
$$G \vdash n \Rightarrow n : \text{int}, \{ \}$$


# **SOLUTIONS TO CONSTRAINTS**



# Solutions

A solution to a system of type constraints is a *substitution*  $S$

- a function from type variables to type schemes
- assume substitutions are defined on all type variables:
  - $S(a) = a$  (for almost all variables  $a$ )
  - $S(a) = s$  (for some type scheme  $s$ )
- $\text{dom}(S) = \text{set of variables s.t. } S(a) \neq a$



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- $\text{dom}(S) = \text{set of variables s.t. } S(a) \neq a$

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

$$b \rightarrow a \rightarrow b \text{ [ int/a, int}\rightarrow\text{bool/b ]}$$
$$= (\text{int}\rightarrow\text{bool}) \rightarrow \text{int} \rightarrow (\text{int}\rightarrow\text{bool})$$


# Solutions

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:

$a = b \rightarrow c$   
 $c = \text{int} \rightarrow \text{bool}$

solution:

$b \rightarrow (\text{int} \rightarrow \text{bool}) / a$   
 $\text{int} \rightarrow \text{bool} / c$   
 $b / b$

constraints with solution applied:

$b \rightarrow (\text{int} \rightarrow \text{bool}) = b \rightarrow (\text{int} \rightarrow \text{bool})$   
 $\text{int} \rightarrow \text{bool} = \text{int} \rightarrow \text{bool}$



# Solutions

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.

A second solution

constraints:

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

solution 1:

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

solution 2:

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



# Solutions

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 -> c with solution applied:

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

solution 2:

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

type b -> c with solution applied:

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





# Solutions

solution 1:

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

type b -> c with solution applied:

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

solution 2:

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

type b -> 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.



# Solutions

solution 1:

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

solution 2:

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

type  $b \rightarrow c$  with solution applied:

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

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  $t$ ,  $S(t) = U(T(t))$



# Solutions

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  $a, b$ )



# Examples

## 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

**Unification:** An algorithm that provides the **principal solution** to a set of constraints (if one exists)

- Unification systematically simplifies a set of constraints:
  - Starting state of unification process:  $(l, q)$
  - Final state of unification process:  $(S, \{ \})$



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  - Final state of unification process:  $(S, \{ \})$

```
type ustate = substitution * constraints
```

```
unify_step : ustate -> ustate
```





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type ustate = substitution * constraints
```

```
unify_step : ustate -> ustate
```

```
unify_step (S, {bool=bool} U q) = (S, q)
```

```
unify_step (S, {int=int} U q) = (S, q)
```



# Unification

**Unification:** An algorithm that provides the **principal solution** to a set of constraints (if one exists)

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type ustate = substitution * constraints
```

```
unify_step : ustate -> ustate
```

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unify_step (S, {bool=bool} U q) = (S, q)
```

```
unify_step (S, {int=int} U q) = (S, q)
```

```
unify_step (S, {a=a} U q) = (S, q)
```



# Unification

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- Unification systematically simplifies a set of constraints:
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  - Final state of unification process:  $(S, \{ \})$

```
type ustate = substitution * constraints
```

```
unify_step : ustate -> ustate
```

```
unify_step (S, {A -> B = C -> D} U q)
```

```
= (S, {A = C, B = D} U q)
```



# Unification

extend substitution  $S$  with additional substitution of  $s$  for  $a$



$$\text{unify\_step}(S, \{a=s\} \cup q) = ([s/a] \circ S, [s/a]q)$$

when  $a$  is not in  $\text{FreeVars}(s)$

“when  $a$  is not in  $\text{FreeVars}(s)$ ” is known as the “occurs check”

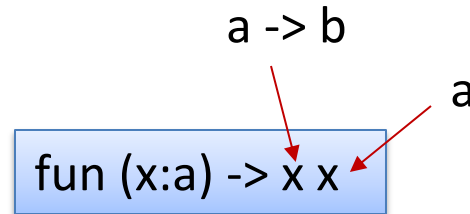


# Occurs Check

Recall this program:

$a \rightarrow b$

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



It generates the the constraints:  $a = a \rightarrow b$

Notice that  $a$  appears in `FreeVars(s)`!

*There is no solution to these constraints!*



# Summary: Unification

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

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

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

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

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



# Irreducible States

Recall: unification simplifies equations step-by-step until

- there are no equations left to simplify:

$(S, \{ \})$

no constraints left.  
S is the final solution!



# Irreducible States

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- or we find basic equations are inconsistent:
  - $\text{int} = \text{bool}$
  - $s1 \rightarrow s2 = \text{int}$
  - $s1 \rightarrow s2 = \text{bool}$
  - $a = s$  (s contains a)

(or is symmetric to one of the above)

In the latter case, the program does not type check.





# **TYPE INFERENCE: THINGS TO REMEMBER**



# Type Inference: Things to remember

**Declarative algorithm:** Given a context  $G$ , and untyped term  $u$ :

- Find  $e, t, q$  such that  $G \vdash u \implies e : t, q$ 
  - understand the constraints that need to be generated
- Find **substitution**  $S$  that acts as a solution to  $q$  via **unification**
  - if no solution exists, the expression does not type check
- Apply  $S$  to  $e$ , ie 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.
- If desired, use the type checking algorithm to validate

