

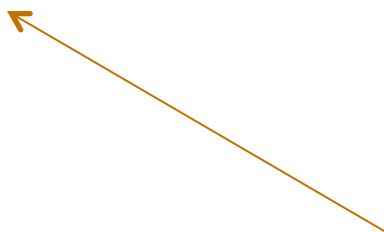
Poly-HO!

COS 326

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polymorphic,
higher-order
programming



Some Design & Coding Rules



Some Design & Coding Rules

- *Laziness* can be a really good force in design.
- Never write the same code twice.
 - factor out the common bits into a re-usable procedure.
 - better, use someone else's (well-tested, well-documented, and well-maintained) procedure.
- Why is this a good idea?
 - why don't we just cut-and-paste snippets of code using the editor instead of abstracting them into procedures?

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- *Laziness* can be a really good force in design.
- Never write the same code twice.
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 - better, use someone else's (well-tested, well-documented, and well-maintained) procedure.
- Why is this a good idea?
 - why don't we just cut-and-paste snippets of code using the editor instead of abstracting them into procedures?
 - find and fix a bug in one copy, have to fix in all of them.
 - decide to change the functionality, have to track down all of the places where it gets used.

Factoring Code in OCaml

Consider these definitions:

```
let rec inc_all (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (hd+1)::(inc_all tl)
```

```
let rec square_all (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (hd*hd)::(square_all tl)
```

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```
let rec inc_all (xs:int list) : int list =  
  match xs with  
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```

```
let rec square_all (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (hd*hd)::(square_all tl)
```

The code is almost identical – factor it out!

Factoring Code in OCaml

A *higher-order* function captures the recursion pattern:

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

Factoring Code in OCaml

A *higher-order* function captures the recursion pattern:

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

Uses of the function:

```
let inc x = x+1;;  
let inc_all xs = map inc xs;;
```


Factoring Code in OCaml

A *higher-order* function captures the recursion pattern:

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

Uses of the function:

```
let inc x = x+1;;  
let inc_all xs = map inc xs;;  
  
let square y = y*y;;  
let square_all xs = map square xs;;
```

Factoring Code in OCaml

A higher-order function captures the recursion pattern:

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

Uses of the function:

```
let inc x = x+1;;  
let inc_all xs = map inc xs;;  
  
let square y = y*y;;  
let square_all xs = map square xs;;
```

Writing little
functions like inc
just so we call
map is a pain.

Factoring Code in OCaml

A higher-order function captures the recursion pattern:

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl)
```

Uses of the function:

```
let inc_all xs = map (fun x -> x + 1) xs  
  
let square_all xs = map (fun y -> y * y) xs;;
```

We can use an
anonymous
function
instead.

Originally,
Church wrote
this function
using λ instead
of **fun**:
($\lambda x. x+1$) or
($\lambda x. x*x$)

Another example

```
let rec sum (xs:int list) : int =
  match xs with
  | [] -> 0
  | hd::tl -> hd + (sum tl)
;;

let rec prod (xs:int list) : int =
  match xs with
  | [] -> 1
  | hd::tl -> hd * (prod tl)
;;
```

Goal: Create a function called reduce that when supplied with a couple of arguments can implement both sum and prod

(Try it/demo)

A generic reducer

```
let add x y = x + y;;  
let mul x y = x * y;;  
  
let rec reduce (f:int->int->int) (u:int) (xs:int list) : int =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;  
  
let sum xs = reduce add 0 xs ;;  
let prod xs = reduce mul 1 xs ;;
```

Using Anonymous Functions

```
let rec reduce (f:int->int->int) (u:int) (xs:int list) : int =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;  
  
let sum xs = reduce (fun x y -> x+y) 0 xs ;;  
let prod xs = reduce (fun x y -> x*y) 1 xs ;;
```

Using Anonymous Functions

```
let rec reduce (f:int->int->int) (u:int) (xs:int list) : int =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;  
  
let sum xs = reduce (fun x y -> x+y) 0 xs ;;  
let prod xs = reduce (fun x y -> x*y) 1 xs ;;  
  
let sum_of_squares xs = sum (map (fun x -> x * x) xs)  
let pairify xs = map (fun x -> (x,x)) xs
```

More on Anonymous Functions

Function declarations are actually abbreviations:

```
let square x = x*x ;;  
let add x y = x+y ;;
```

are *syntactic sugar* for:

```
let square = (fun x -> x*x) ;;  
let add = (fun x y -> x+y) ;;
```

So, **fun's** are values we can bind to a variable,
just like 3 or “moo” or true.

O'Caml obeys the *principle of orthogonal language design*.

One argument, one result

Actually, functions are even simpler.

All functions take one argument and return one result. So,

```
let add = (fun x y -> x+y)
```

is shorthand for:

```
let add = (fun x -> (fun y -> x+y))
```

That is, add is a function which:

- when given a value x, *returns a function* (fun y -> x+y) which:
 - when given a value y, returns x+y.

Curried Functions

```
fun x -> (fun y -> x+y)    (* curried *)  
fun x y -> x + y          (* curried *)  
fun (x,y) -> x+y         (* uncurried *)
```

Currying: encoding a multi-argument function using nested, higher-order functions.



Named after the logician **Haskell B. Curry**.

- was trying to find minimal logics that are powerful enough to encode traditional logics.
- much easier to prove something about a logic with 3 connectives than one with 20.
- the ideas translate directly to math (set & category theory) as well as to computer science.
- (actually, Curry ripped off **Moses Schönfinkel**)
- (thankfully, we don't have to talk about *Schönfinkelled* functions)

What is the type of add?

```
let add = (fun x -> (fun y -> x+y))
```

Add's type is:

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

which we can write as:

```
int -> int -> int
```

That is, the arrow type is right-associative.

What's so good about Currying?

In addition to simplifying the language (orthogonal design), currying functions so that they only take one argument leads to two major wins:

1. We can *partially apply* a function.
2. We can more easily *compose* functions.



Partial Application

```
let add = (fun x -> (fun y -> x+y)) ;;
```

Curried functions allow defs of new, **partially applied** functions:

```
let inc = add 1;;
```

Equivalent to writing:

```
let inc = (fun y -> 1+y) ;;
```

which is equivalent to writing:

```
let inc y = 1+y;;
```

also:

```
let inc2 = add 2;;  
let inc3 = add 3;;
```

SIMPLE REASONING ABOUT HIGHER-ORDER FUNCTIONS

Reasoning About Definitions

```
let rec map f xs =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;  
  
let square_all = map square;;
```

Fundamental question: How can I rewrite these definitions so my program is simpler, easier to understand, more concise, can be refactored, ...

I want some *rules* for doing so that never fail.

Simple Equational Reasoning

Rewrite 1 (Function de-sugaring):

```
let f x = body
```

==

```
let f = (fun x -> body)
```

Rewrite 2 (Substitution):

```
(fun x -> ... x ...) arg
```

==

```
... arg ...
```

if arg is a value or, when executed, will always terminate without effect and produce a value

Rewrite 3 (Eta-expansion):

```
let f = def
```

==

```
let f x = (def) x
```

if f has a function type

chose name x wisely so it does not shadow other names used in def

Eliminating the Sugar in Map

```
let rec map f xs =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

Eliminating the Sugar in Map

```
let rec map f xs =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

```
let rec map =  
  (fun f ->  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (f hd)::(map f tl))));;
```

Substitute map in to square_all

```
let rec map =  
  (fun f ->  
    (fun xs ->  
      match xs with  
        | [] -> []  
        | hd::tl -> (f hd)::(map f tl)));;
```

```
let square_all =  
  map square ;;
```

Substitute map in to square_all

```
let rec map =  
  (fun f ->  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (f hd)::(map f tl)));;
```

```
let square_all =  
  (fun f ->  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (f hd)::(map f tl)  
    )  
  ) square ;;
```

Substitute Square

```
let rec map =  
  (fun f ->  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (f hd) :: (map f tl))) ;;
```

```
let square_all =  
  (  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (square hd) :: (map square tl)  
    )  
  )  
  
  ;;
```

argument **square** substituted
for parameter **f**

```
graph TD  
  A[argument square substituted for parameter f] --> B[square hd]  
  A --> C[map square tl]
```

Expanding map square

```
let rec map =  
  (fun f ->  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (f hd)::(map f tl))));;
```

```
let square_all ys =  
  (fun xs ->  
    match xs with  
    | [] -> []  
    | hd::tl -> (square hd)::(map square tl)  
  ) ys  
;;
```

add argument
via eta-expansion


Expanding map square

```
let rec map =  
  (fun f ->  
    (fun xs ->  
      match xs with  
      | [] -> []  
      | hd::tl -> (f hd)::(map f tl))));;
```

```
let square_all ys =
```

```
  match ys with  
  | [] -> []  
  | hd::tl -> (square hd)::(map square tl)
```

substitute again
(argument ys for
parameter xs)



```
;;
```

So Far

```
let rec map f xs =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;  
  
let square_all xs = map square xs
```

```
let square_all ys =  
  match ys with  
  | [] -> []  
  | hd::tl -> (square hd)::(map square tl)  
;;
```

```
let square_all ys =  
  match ys with  
  | [] -> []  
  | hd::tl -> (square hd)::(square_all tl)  
;;
```

proof by
simple
rewriting
unrolls
definition
once

proof
by induction
eliminates
recursive
function
map

What Happened?

We saw this:

```
let rec map f xs =  
    match xs with  
    | [] -> []  
    | hd::tl -> (f hd)::(map f tl);;  
  
let square_all ys = map square
```

Is equivalent to this:

```
let square_all ys =  
    match ys with  
    | [] -> []  
    | hd::tl -> (square hd)::(map square tl)  
;;
```

Moral of the story

- (1) OCaml's *HOT* (higher-order, typed) functions capture recursion patterns
- (2) we can figure out what is going on by *equational reasoning*.
- (3) ... but we typically need to do *proofs by induction* to reason about recursive (inductive) functions

Exercise: Use rewriting to simplify sum, prod

```
let rec reduce f u xs =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;  
  
let sum xs = reduce add 0 xs ;;  
let prod xs = reduce mul 1 xs ;;
```

Here's an annoying thing

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

What if I want to increment a list of floats?

Alas, I can't just call this map. It works on ints!

Here's an annoying thing

```
let rec map (f:int->int) (xs:int list) : int list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;
```

What if I want to increment a list of floats?

Alas, I can't just call this map. It works on ints!

```
let rec mapfloat (f:float->float) (xs:float list) :  
  float list =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(mapfloat f tl);;
```



Turns out

```
let rec map f xs =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl);;  
  
map (fun x -> x + 1) [1; 2; 3; 4] ;;  
  
map (fun x -> x +. 2.0) [3.1415; 2.718; 42.0] ;;  
  
map String.uppercase ["greg"; "victor"; "joe"] ;;
```



Type of the undecorated map?

```
let rec map f xs =  
  match xs with  
  | [] -> []  
  | hd::tl -> (f hd)::(map f tl)  
;;
```

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

Type of the undecorated map?

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

We often use greek letters like α or β to represent type variables.

Read as: for any types $'a$ and $'b$, if you give map a function from $'a$ to $'b$, it will return a function which when given a list of $'a$ values, returns a list of $'b$ values.

We can say this explicitly

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

The Ocaml compiler is smart enough to figure out that this is the *most general* type that you can assign to the code.

We say map is *polymorphic* in the types 'a and 'b – just a fancy way to say map can be used on many types.

Java generics derived from ML-style polymorphism (but added after the fact and more complicated due to subtyping)

More realistic polymorphic functions

```
let rec merge (lt:'a->'a->bool) (xs:'a list) (ys:'a list)
    : 'a list =
  match (xs,ys) with
  | ([],_) -> ys
  | (_,[]) -> xs
  | (x::xst, y::yst) ->
    if lt x y then x::(merge lt xst ys)
    else y::(merge lt xs yst) ;;
```

```
let rec split (xs:'a list) (ys:'a list) (zs:'a list)
    : 'a list * 'a list =
  match xs with
  | [] -> (ys, zs)
  | x::rest -> split rest zs (x::ys) ;;
```

```
let rec mergesort (lt:'a->'a->bool) (xs:'a list) : 'a list =
  match xs with
  | ([] | _::[]) -> xs
  | _ -> let (first,second) = split xs [] [] in
    merge lt (mergesort lt first) (mergesort lt second) ;;
```

More realistic polymorphic functions

```
mergesort : ('a->'a->bool) -> 'a list -> 'a list
```

```
mergesort (<) [3;2;7;1]  
  == [1;2;3;7]
```

```
mergesort (>) [2.718; 3.1415; 42.0]  
  == [42.0 ; 3.1415; 2.718]
```

```
mergesort (fun x y -> String.compare x y < 0) ["Hi"; "Bi"]  
  == ["Bi"; "Hi"]
```

```
let int_sort = mergesort (<) ;;
```

```
let int_sort_down = mergesort (>) ;;
```

```
let str_sort =
```

```
  mergesort (fun x y -> String.compare x y < 0) ;;
```

Another Interesting Function

```
let comp f g x = f (g x) ;;
```

```
let mystery = comp (add 1) square ;;
```



```
let comp = fun f -> (fun g -> (fun x -> f (g x))) ;;
```

```
let mystery = comp (add 1) square ;;
```



```
let mystery =  
  (fun f -> (fun g -> (fun x -> f (g x)))) (add 1) square ;;
```



```
let mystery = fun x -> (add 1) (square x) ;;
```



```
let mystery x = (add 1) ((square) x) ;;
```

Optimization

What does this program do?

```
map f (map g [x1; x2; ...; xn])
```

For each element of the list $x_1, x_2, x_3 \dots x_n$, it executes g , creating:

```
map f ([g x1; g x2; ...; g xn])
```

Then for each element of the list $[g x_1, g x_2, g x_3 \dots g x_n]$, it executes f , creating:

```
[f (g x1); f (g x2); ...; f (g xn)]
```

Is there a faster way? Yes! (And query optimizers for SQL do it for you.)

```
map (comp f g) [x1; x2; ...; xn]
```

What is the type of comp?

```
let comp f g x = f (g x) ;;
```

What is the type of comp?

```
let comp f g x = f (g x) ;;
```

```
comp : ('b -> 'c) ->  
        ('a -> 'b) ->  
        ('a -> 'c)
```

How about reduce?

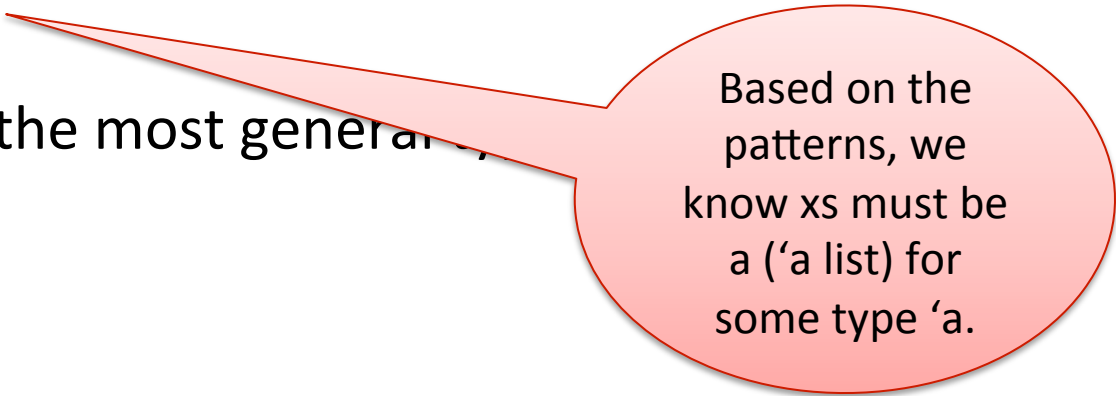
```
let rec reduce f u xs =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

How about reduce?

```
let rec reduce f u xs =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general,



Based on the patterns, we know xs must be a ('a list) for some type 'a.

How about reduce?

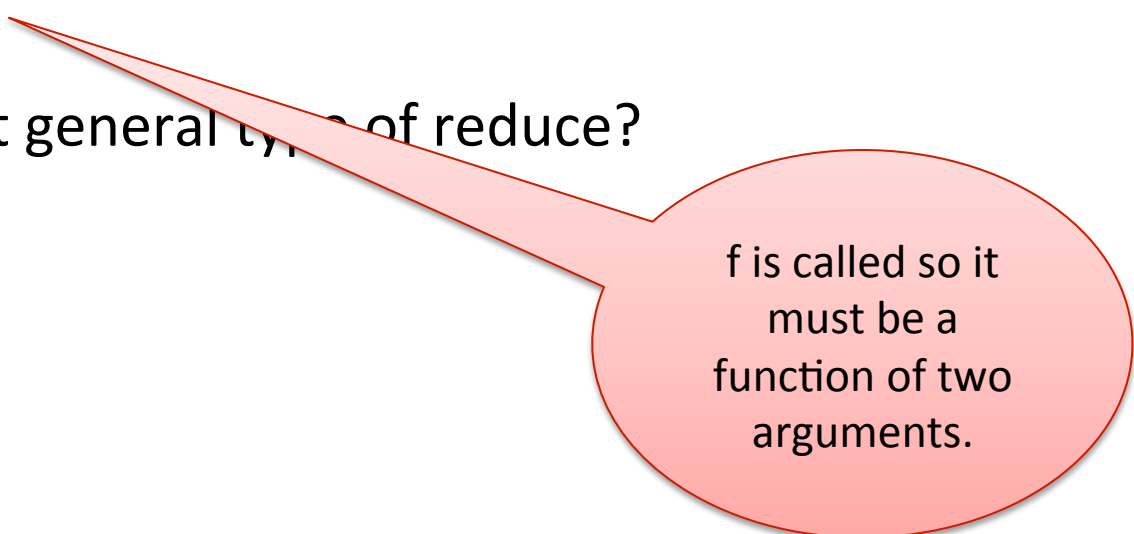
```
let rec reduce f u (xs: `a list) =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

How about reduce?

```
let rec reduce f u (xs: 'a list) =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?



f is called so it
must be a
function of two
arguments.

How about reduce?

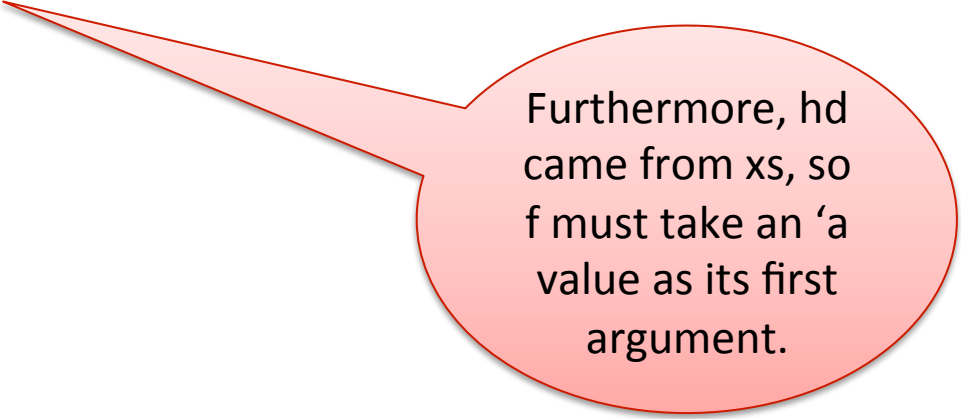
```
let rec reduce (f:? -> ? -> ?) u (xs: 'a list) =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

How about reduce?

```
let rec reduce (f:? -> ? -> ?) u (xs: 'a list) =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?



Furthermore, hd came from xs, so f must take an 'a value as its first argument.

How about reduce?

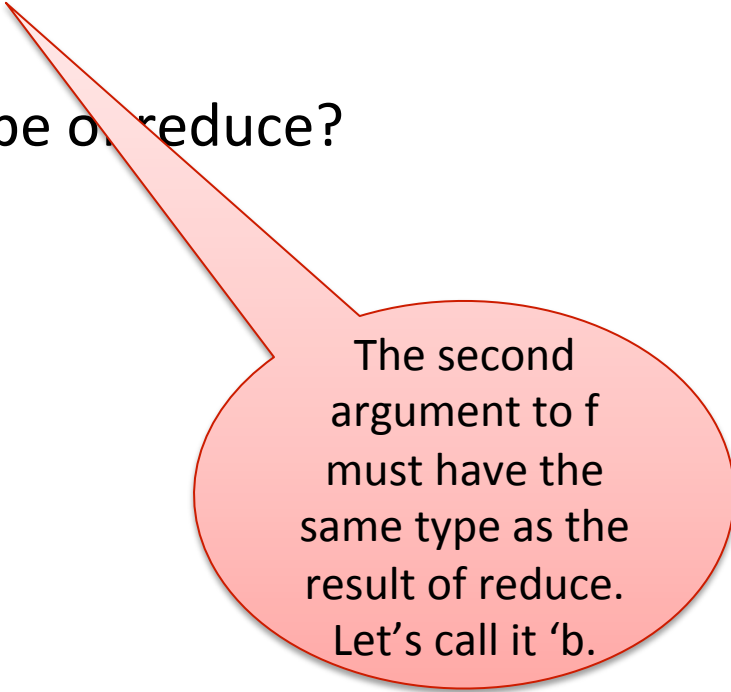
```
let rec reduce (f:'a -> ? -> ?) u (xs: 'a list) =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

How about reduce?

```
let rec reduce (f:'a -> ? -> ?) u (xs: 'a list) =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?



The second argument to f must have the same type as the result of reduce. Let's call it 'b'.

How about reduce?

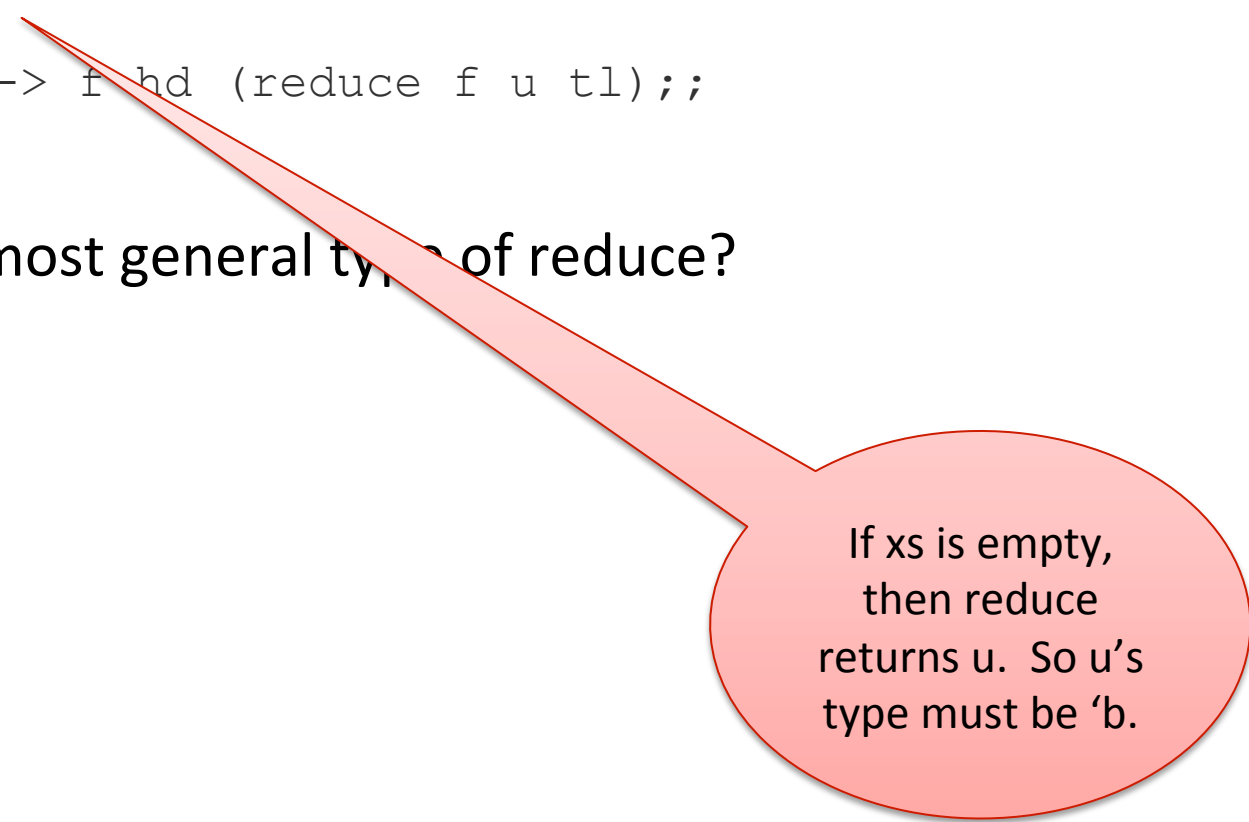
```
let rec reduce (f:'a -> 'b -> 'b) u (xs: 'a list) : 'b =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

How about reduce?

```
let rec reduce (f:'a -> 'b -> 'b) u (xs: 'a list) : 'b =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?



If xs is empty,
then reduce
returns u. So u's
type must be 'b.

How about reduce?

```
let rec reduce (f:'a -> 'b -> 'b) (u:'b) (xs: 'a list) : 'b =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

How about reduce?

```
let rec reduce (f:'a -> 'b -> 'b) (u:'b) (xs: 'a list) : 'b =  
  match xs with  
  | [] -> u  
  | hd::tl -> f hd (reduce f u tl);;
```

What's the most general type of reduce?

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

The List Library

NB: map and reduce are already defined in the List library.

- However, reduce is called “fold_right”.
- (Good bet there’s a “fold_left” too.)

I’ll continue to call “fold_right” reduce for 3 reasons:

- Analogy with Google’s Map/Reduce
- The library’s arguments to fold_right are in the wrong order
- Makes the example fit on a slide.

Summary

- Map and reduce are two *higher-order functions* that capture very, very common *recursion patterns*
- Reduce is especially powerful:
 - related to the “visitor pattern” of OO languages like Java.
 - can implement most list-processing functions using it, including things like copy, append, filter, reverse, map, etc.
- We can write clear, terse, reusable code by exploiting:
 - higher-order functions
 - anonymous functions
 - first-class functions
 - polymorphism

Practice Problems

Using map, write a function that takes a list of pairs of integers, and produces a list of the sums of the pairs.

- e.g., `list_add [(1,3); (4,2); (3,0)] = [4; 6; 3]`
- Write `list_add` directly using `reduce`.

Using map, write a function that takes a list of pairs of integers, and produces their quotient if it exists.

- e.g., `list_div [(1,3); (4,2); (3,0)] = [Some 0; Some 2; None]`
- Write `list_div` directly using `reduce`.

Using reduce, write a function that takes a list of optional integers, and filters out all of the `None`'s.

- e.g., `filter_none [Some 0; Some 2; None; Some 1] = [0;2;1]`
- Why can't we directly use `filter`? How would you generalize `filter` so that you can compute `filter_none`?

Using reduce, write a function to compute the sum of squares of a list of numbers.

- e.g., `sum_squares = [3,5,2] = 38`