

# Formal Methods

## Lecture 3

(B. Pierce's slides for the book ‘Types and Programming Languages’)

# Programming With Functions

## Functions as Data

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Functions in OCaml are *first class* — they have the same rights and privileges as values of any other types. E.g., they can be

- ▲ passed as arguments to other functions
- ▲ returned as results from other functions
- ▲ stored in data structures such as tuples and lists
- ▲ etc.

## map: "apply-to-each"

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OCaml has a predefined function `List.map` that takes a function `f` and a list `l` and produces another list by applying `f` to each element of `l`. We'll soon see how to define `List.map`, but first let's look at some examples.

```
# List.map square [1; 3; 5; 9; 2; 21];;  
- : int list = [1; 9; 25; 81; 4; 441]  
  
# List.map not [false; false; true];;  
- : bool list = [true; true; false]
```

Note that `List.map` is polymorphic: it works for lists of integers, strings, booleans, etc.

## More on map

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An interesting feature of `List.map` is its first argument is itself a function. For this reason, we call `List.map` a *higher-order* function.

Natural uses for higher-order functions arise frequently in programming. One of OCaml's strengths is that it makes higher-order functions very easy to work with.

In other languages such as Java, higher-order functions can be (and often are) simulated using objects.

## filter

Another useful higher-order function is `List.filter`. When applied to a list `l` and a boolean function `p`, it builds a list of the elements from `l` for which `p` returns `true`.

```
# let rec even (n:int) =  
  if n=0 then true else if n=1 then false  
  else if n<0 then even (-n)  
  else even (n-2);;  
val even : int -> bool = <fun>  
  
# List.filter even [1; 2; 3; 4; 5; 6; 7; 8; 9];;  
- : int list = [2; 4; 6; 8]  
  
# List.filter palindrome  
  [[1]; [1; 2; 3]; [1; 2; 1]; []];;  
- : int list list = [[1]; [1; 2; 1]; []]
```

## Defining map

List.map comes predefined in the OCaml system, but there is nothing magic about it—we can easily define our own `map` function with the same behavior.

```
let rec map (f: 'a->' b) (l: 'a list) =  
    if l = [] then []  
    else f (List.hd l) :: map f (List.tl l)  
val map : ('a -> 'b) -> 'a list -> 'b list = <fun>
```

The type of `map` is probably even more polymorphic than you expected! The list that it returns can actually be of a *different* type from its argument:

```
# map String.length ["The"; "quick"; "brown"; "fox"];;  
- : int list = [3; 5; 5; 3]
```

## Defining filter

Similarly, we can define our own `filter` that behaves the same as `List.filter`.

```
# let rec filter (p: 'a->bool) (l: 'alist) =  
  if l = [] then  
    []  
  else if p (List.hd l) then  
    List.hd l :: filter p (List.tl l)  
  else  
    filter p (List.tl l)  
  
val filter : ('a -> bool) -> 'alist -> 'alist  
= <fun>
```



## Multi-parameter functions

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We have seen two ways of writing functions with multiple parameters:

```
# let foo x y = x + y;;  
val foo : int -> int -> int = <fun>  
  
# let bar (x,y) = x + y;;  
val bar : int * int -> int = <fun>
```

The first takes its two arguments separately; the second takes a tuple and uses a pattern to extract its first and second components.

The syntax for applying these two forms of function to their arguments differs correspondingly:

```
# foo 2 3;;
```

```
- : int = 5
```

```
# bar (4,5);;
```

```
- : int = 9
```

```
# foo (2,3);;
```

This expression has type `int * int` but  
is here used with type `int`

```
# bar 4 5;;
```

This function is applied to too many arguments

## Partial Application

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One advantage of the first form of multiple-argument function is that such functions may be *partially applied*.

```
# let foo2 = foo 2;;  
val foo2 : int -> int = <fun>  
  
# foo2 3;;  
- : int = 5  
-  
  
# foo2 5;;  
- : int = 7  
  
# List.map foo2 [3;6;10;100];;  
- : int list = [5; 8; 12; 102]
```

## Currying

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Obviously, these two forms are closely related — given one, we can easily define the other.

```
# let foo' x y = bar (x,y);;  
val foo' : int -> int -> int = <fun>  
  
# let bar' (x,y) = foo x y;;  
val bar' : int * int -> int = <fun>
```

## Currying

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Indeed, these transformations can themselves be expressed as (higher-order) functions:

```
# let curry f x y = f (x,y);;
val curry : ('a * 'b -> 'c) -> 'a -> 'b -> 'c
           = <fun>

# let foo' ' = curry bar;;
val foo' ' : int -> int -> int = <fun>

# let uncurry f (x,y) = f x y;;
val uncurry : ('a -> 'b -> 'c) -> 'a * 'b -> 'c
            = <fun>

# let bar' ' = uncurry foo;;
val bar' ' : int * int -> int = <fun>
```

## A Closer Look

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The type `int -> int -> int` can equivalently be written `int -> (int -> int)`.

That is, a function of type `int -> int -> int` is actually a function that, when applied to an integer, yields a *function* that, when applied to an integer, yields an integer.

Similarly, an application like `foo 2 3` is actually shorthand for `(foo 2) 3`.

Formally: `->` is right-associative and application is left-associative.

## Anonymous Functions

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It is fairly common in OCaml that we need to define a function and use it just once.

```
# let timesthreeplustwo x = x*3 + 2;;  
val timesthreeplustwo : int -> int = <fun>  
  
# List.map timesthreeplustwo [4;3;77;12];;  
- : int list = [14; 11; 233; 38]
```

To save making up names for such functions, OCaml offers a mechanism for writing them in-line:

```
# List.map (fun x -> x*3 + 2) [4;3;77;12];;  
- : int list = [14; 11; 233; 38]
```

## Anonymous Functions

Anonymous functions may appear, syntactically, in the same places as values of any other types.

For example, the following let-bindings are completely equivalent:

```
# let double x = x*2;;  
val double : int -> int = <fun>  
  
# let double' = (fun x -> x*2);;  
val double' : int -> int = <fun>  
  
# double 5;;  
- : int = 10  
  
# double' 5;;  
- : int = 10
```



## Anonymous Functions

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We can even write:

```
# (fun x -> x*2) 5;;  
- : int = 10
```

Or (slightly more usefully):

```
# (if 5*5 > 20  
    then (fun x -> x*2)  
    else (fun x -> x+3))  
5;;  
- : int = 10
```

The conditional yields a function on the basis of some boolean test, and its result is then applied to 5.

## Quick Check

---

What is the type of `l`?

```
# let l = [ (fun x -> x + 2);  
            (fun x -> x * 3);  
            (fun x -> if x > 4 then 0 else 1) ];;
```

## Applying a list of functions

---

```
# let l  = [ (fun x -> x + 2);  
             (fun x -> x * 3);  
             (fun x -> if x > 4 then 0 else 1) ];;  
val l  : (int -> int) list = [<fun>; <fun>; <fun>]  
  
# let applyto x f = f x;;  
val applyto : 'a -> ('a -> 'b) -> 'b = <fun>  
  
# List.map (applyto 10) l;;  
- : int list = [12; 30; 0]  
  
# List.map (applyto 2) l;;  
- : int list = [4; 6; 1]
```

## Another useful higher-order function: fold

```
# let rec fold f l acc
  = match l with
    [] -> acc
  | a::l -> f a (fold f l acc);;
val fold : ('a -> 'b -> 'b) -> 'a list -> 'b -> 'b
```

For example:

```
# fold (fun a b -> a + b) [1; 3; 5; 100] 0;;
- : int = 109
```

In general:

$$\begin{array}{c} f \text{ [a1; ...; an] b} \\ \text{is} \\ f \text{ a1 (f a2 (... (f an b) ...))}. \end{array}$$

## Using fold

---

Most of the list-processing functions we have seen can be defined compactly in terms of `fold`:

```
# let listSum l =  
    fold (fun a b -> a + b) l 0;;  
val listSum : int list -> int = <fun>  
  
# let length l =  
    fold (fun a b -> b + 1) l 0;;  
val length : 'a list -> int = <fun>  
  
# let filter p l =  
    fold  
        (fun a b -> if p a then (a::b) else b)  
        l [];
```

## Using fold

---

And even:

```
# (* List of numbers from m to n, as before *)
let rec fromTo m n =
  if n < m then []
  else m:: fromTo (m+1) n;;
val fromTo : int -> int -> int list = <fun>

# let fact n =
  fold (fun a b -> a * b) (fromTo 1 n) 1;;
val fact : int -> int = <fun>
```

## Quick Check

---

What is the type of this function?

```
# let foo l =  
  fold (fun a b -> List.append b [a]) l [];;
```

What does it do?

## Forms of fold

---

The OCaml `List` module actually provides two folding functions:

```
List.fold_left  
  : ('a -> 'b -> 'a) -> 'a    -> 'b list -> 'a  
  
List.fold_right  
  : ('a -> 'b -> 'b) -> 'a list -> 'b    -> 'b
```

The one we're calling `fold` is `List.fold_right`.

`List.fold_left` performs the same basic operation but takes its arguments in a different order.



## The unit type

---

OCaml provides another built-in type called `unit`, with just one inhabitant, written `()`.

```
# let x = ();;  
val x : unit = ()  
  
# let f () = 23 + 34;;  
val f : unit -> int = <fun>  
  
# f ();;  
- : int = 57
```

Why is this useful?

## Uses of unit

---

A function from `unit` to 'a is a *delayed computation* of type 'a. When we define the function...

```
# let f () = <long and complex calculation>;;  
val f : unit -> int = <fun>
```

... the long and complex calculation is just boxed up in a *closure* that we can save for later (by binding it to a variable, e.g.). When we actually need the result, we apply `f` to `()` and the calculation actually happens:

```
# f ();;  
- : int = 57
```

## Thunks

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A function accepting a `unit` argument is often called a *thunk*. Thunks are widely used in functional programming.

A typical example...

Suppose we are writing a function where we need to make sure that some “finalization code” gets executed, even if an exception is raised.

```
# let read file =  
  let chan = open_in file in  
  try  
    let nbytes = in_channel_length chan in  
    let string = String.create nbytes in  
    really_input chan string 0 nbytes;  
    close_in chan;  
    string  
  with exn ->  
    (* finalize channel *)  
    close_in chan;  
    (* re-raise exception *)  
    raise exn;;
```

We can avoid duplicating the finalization code by wrapping it in a thunk:

```
# let read file =  
  let chan = open_in file in  
  let finalize () = close_in chan in  
  try  
    let nbytes = in_channel_length chan in  
    let string = String.create nbytes in  
    really_input chan string 0 nbytes;  
    finalize();  
    string  
  with exn ->  
    (* finalize channel *)  
    finalize();  
    (* re-raise exception *)  
    raise exn;;
```

(The `try...with...` form is OCaml's syntax for handling exceptions.)

In fact, we can go further...

```
# let unwind_protect body finalize =  
  try  
    let res = body() in  
    finalize();  
    res  
  with exn ->  
    finalize();  
    raise exn;;  
  
# let read file =  
  let chan = open_in file in  
  unwind_protect  
    (fun () ->  
      let nbytes = in_channel_length chan in  
      let string = String.create nbytes in  
      really_input chan string 0 nbytes;  
      string)  
    (fun () -> close_in chan);;
```

# A Larger Example: Streams

## Lazy streams

---

A thunk is a *lazy computation*: it doesn't do any work until it is explicitly asked for its value.

We can even use thunks to represent *infinite* computations, as long as we only ask for their results a little bit at a time.

For example:

```
# type 'a stream =  
  Stream of 'a * (unit -> 'a stream);;
```

That is, an 'a stream is a pair of an 'a value and a thunk that, when evaluated, yields another 'a stream.



```

# type ' astream =
    Stream of ' a* (unit -> ' astream);;

# let rec upfrom x =
    Stream (x, fun () -> upfrom (x+1));;
val upfrom : int -> int stream = <fun>

# let rec first n (Stream (x,f)) =
    if n=0 then []
    else x :: (first (n-1) (f()));;
val first : int -> ' astream -> ' alist = <fun>

# let show s = first 15 s;;
val show : ' astream -> ' alist = <fun>

# show (upfrom 3);;
- : int list = [3; 4; 5; 6; 7; 8; 9; 10; 11;
                12; 13; 14; 15; 16; 17]

```

## Some convenience functions for streams

---

```
# let stream_cons x f = Stream (x, f);;
val stream_cons :
  'a -> (unit -> 'a stream) -> 'a stream = <fun>

# let stream_hd (Stream (x,f)) = x;;
val stream_hd : 'a stream -> 'a = <fun>

# let stream_tl (Stream (x,f)) = f ();;
val stream_tl : 'a stream -> 'a stream = <fun>

# let rec first n s =
  if n=0 then []
  else (stream_hd s)
      :: (first (n-1) (stream_tl s));;
val first : int -> 'a stream -> 'a list = <fun>
```

## Transforming streams

---

```
# let rec map_stream f s =  
  stream_cons  
    (f (stream_hd s))  
    (fun () -> map_stream f (stream_tl s));;  
val map_stream  
  : ('a -> 'b) -> 'a stream -> 'b stream  
  = <fun>  
  
# show (map_stream (fun x -> x mod 4) (upfrom 0));;  
- : int list =  
  [0; 1; 2; 3; 0; 1; 2; 3; 0; 1; 2; 3; 0; 1; 2]
```

## Transforming streams

---

```
# let indivisible_by y x = (x mod y <> 0);;
val indivisible_by : int -> int -> bool = <fun>

# show (map_stream (indivisible_by 3) (upfrom 0));;
- : bool list =
  [false; true; true; false; true; true;
   false; true; true; false; true; true;
   false; true; true]
```

## Filtering streams

---

```
# let rec filter_stream p s =  
  if p (stream_hd s)  
  then Stream(  
    stream_hd s,  
    fun() -> filter_stream p (stream_tl s) )  
  else filter_stream p (stream_tl s);;  
val filter_stream :  
  ('a -> bool) -> 'a stream -> 'a stream = <fun>  
  
# show (filter_stream (indivisible_by 3)  
  (upfrom 0));;  
- : int list = [1; 2; 4; 5; 7; 8; 10; 11; 13;  
  14; 16; 17; 19; 20; 22]
```

## A stream of prime numbers

---

```
# let rec sieve_filter s =  
  stream_cons  
    (stream_hd s)  
    (fun () ->  
      sieve_filter  
        (filter_stream  
          (indivisible_by (stream_hd s))  
            (stream_tl s))));  
val sieve_filter : int stream -> int stream = <fun>  
  
# let primes = sieve_filter (upfrom 2);;  
  
# show primes;;  
- : int list = [2; 3; 5; 7; 11; 13; 17; 19; 23;  
                29; 31; 37; 41; 43; 47]
```

## A stream of ...?

---

```
# let divisible_by y x = (x mod y = 0);;

# let rec funny_filter s
  = stream_cons
    (stream_hd s)
    (fun () ->
      funny_filter
        (filter_stream
          (divisible_by (stream_hd s))
          (stream_tl s))));;

# let funny = funny_filter (upfrom 1);;
```

What familiar sequence is `funny`?

```
# show funny;;  
- : int list = [1; 2; 4; 8; 16; 32; 64; 128;  
                256; 512; 1024; 2048; 4096;  
                8192; 16384; 32768]
```



# A Taste of Continuations

Consider this pair of functions:

```
# let f x = x + 3;;  
# let g y = 22 * (f y);;
```

Note that, after the call `(f y)` returns, we still have a multiply left to do.

We can rewrite `g` to make this remaining work more explicit.

```
# let f x = x + 3;;  
# let g y = (fun r -> 22*r) (f y);;
```

The function `(fun r -> 22*r)` is the *continuation* of the expression `(f y)`.

In general, a continuation is a function representing “the work left to be done” when some other computation is finished.

Next, we can pass this continuation as an extra parameter to `f`, delegating to `f` the responsibility of calling it:

```
# let f x k = k (x + 3);;  
# let g y = f y (fun r -> 22*r);;
```

In general, a continuation is a function representing “the work left to be done” when some other computation is finished.

The function `f` is said to be written in *continuation-passing style*.

Is this useful...?

## A simple application of continuations

Consider the following function for multiplying lists of integers:

```
# let rec listProd l =  
  match l with  
  | [] -> 1  
  | x::rest -> x * (listProd rest);;  
val listProd : int list -> int = <fun>  
  
# listProd [2;5;23;7;1;7];;  
- : int = 11270  
  
# listProd [2;5;23;7;1;0;7];;  
- : int = 0
```

Observe that, if `l` contains a `0` element, then the result of `listProd` will always be `0`. Can we avoid doing any multiplies (whatsoever!) in this case?

First, let's rewrite `listProd` to make the continuation of the recursive call explicit:

```
# let rec listProd l =  
  match l with  
  [] -> 1  
  | x::rest -> (fun y -> x * y) (listProd rest);;
```

As before, this listProd...

```
# let rec listProd l =  
  match l with  
  [] -> 1  
  | x::rest -> (fun y -> x * y) (listProd rest);;
```

... can now be transformed by *passing the continuation* as an extra argument to the recursive call, and *delegating responsibility* for invoking the continuation at the appropriate moment:

```
# let listProd l =  
  let rec listProdAux l k =  
    match l with  
    [] ->  
      k 1  
    | x::rest ->  
      listProdAux rest (fun y -> k (x*y))  
  in listProdAux l (fun x -> x);;
```

Finally, we can add a clause to `listProdAux` that handles the case where a 0 is found in the list by immediately returning 0 *without calling the continuation!*

```
# let listProd l =  
  let rec listProdAux l k =  
    match l with  
    | [] -> k l  
    | 0::rest ->  
      0  
    | x::rest ->  
      listProdAux rest (fun y -> k (x*y))  
  in listProdAux l (fun x -> x);;
```



## Uses of continuations

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- ▲ Functions can be written to take *multiple continuations* — e.g., a search algorithm might take both a success continuation and a failure continuation  
Gives a clean and flexible way to implement *backtracking* control structures
- ▲ Other *advanced control structures* such as exceptions, coroutines, and (non-preemptive) concurrency can be programmed up using continuations.
- ▲ *Compilers* often transform whole programs into continuation-passing style internally, to make flow of control explicit in the code
- ▲ Some languages (Scheme, SML/NJ) provide a *primitive* (`call-with-current-continuation`) that “reifies” the continuation at any point in the program and turns it into a data value
- ▲ *Many refinements and variations* have been studied.

## The rest of OCaml

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We've seen only a small part of the OCaml language. Some other highlights:

- △ advanced *module system*
- △ imperative features (`ref` cells, arrays, etc.); the “mostly functional” programming style
- △ objects and classes

## Closing comments on OCaml

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Some *common strong points* of OCaml, Java, C#, etc.

- ▲ strong, static typing (*no core dumps!*)
- ▲ garbage collection (*no manual memory management!!*)

Some *advantages* of OCaml compared to Java, etc.

- ▲ excellent implementation (fast, portable, etc.)
- ▲ powerful module system
- ▲ streamlined support for higher-order programming
- ▲ sophisticated pattern matching (no “visitor patterns”)

Some *disadvantages*:

- ▲ smaller developer community
- ▲ smaller collection of libraries
- ▲ object system somewhat clunky

## Going Meta...

---

The functional programming style used in OCaml is based on treating *programs as data* — i.e., on writing functions that manipulate other functions as their inputs and outputs.

Everything in this course is based on treating *programs as mathematical objects* — i.e., we will be building mathematical theories whose basic objects of study are programs (and whole programming languages).

Jargon: We will be studying the *metatheory* of programming languages.

## Warning!

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The material in the next couple of lectures is more slippery than it may first appear.

"I believe it when I hear it" is not a sufficient test of understanding.

A much better test is "I can explain it so that someone else believes it."

"You never really misunderstand  
something  
until you try to teach it..."  
— Anon.