

Functional Programming

WS 2012/13

Harald Zankl (VO)

Cezary Kaliszyk (PS) Thomas Sternagel (PS)

Computational Logic
Institute of Computer Science
University of Innsbruck

week 12



Overview

- Week 12 - Laziness
 - Summary of Weeks 10 & 11
 - Lazy Lists
 - Fibonacci Numbers
 - The Sieve of Eratosthenes



Overview

- Week 12 - Laziness
 - Summary of Weeks 10 & 11
 - Lazy Lists
 - Fibonacci Numbers
 - The Sieve of Eratosthenes



Type Checking

- prove that expression e has a type τ w.r.t. environment E
- formally: $E \vdash e : \tau$
- use the inference rules of \mathcal{C} to do so

Type Inference

- find most general type $\alpha_0\sigma$ for expression e w.r.t. environment E
- formally: $E \triangleright e : \alpha_0$
- task is split into two parts:
 1. transform given type inference problem into unification problem
 2. solve the unification problem (result is substitution σ)

This Week

Practice I

OCaml introduction, lists, strings, trees

Theory I

lambda-calculus, evaluation strategies, induction, reasoning about functional programs

Practice II

efficiency, tail-recursion, combinator-parsing

Theory II

type checking, type inference

Advanced Topics

lazy evaluation, infinite data structures, monads, ...

Overview

- Week 12 - Laziness
 - Summary of Weeks 10 & 11
 - **Lazy Lists**
 - Fibonacci Numbers
 - The Sieve of Eratosthenes



Motivation

Idea

Only compute values that are needed for the final result.

Motivation

Idea

Only compute values that are needed for the final result.

Example

In the program

```
let f1 x = x + 1 in
```

```
let f2 x = (* something non-terminating *) in
```

```
let x      = read_int() in  
Lst.hd(f1 x :: f2 x)
```

the value of 'f2 x' is not needed. Nevertheless, the whole program does not terminate.

Custom Lazy Lists – 1st Iteration

Type

```
type 'a llist = Nil | Cons of ('a * 'a llist)
```

Custom Lazy Lists – 1st Iteration

Type

```
type 'a llist = Nil | Cons of ('a * 'a llist)
```

Example

Nil	([])
Cons(1,Nil)	([1])
Cons(2,Cons(1,Nil))	([2;1])

Custom Lazy Lists – 1st Iteration

Type

```
type 'a llist = Nil | Cons of ('a * 'a llist)
```

Example

```
Nil                ([])  
Cons(1,Nil)       ([1])  
Cons(2,Cons(1,Nil)) ([2;1])
```

Functions

```
let hd = function Nil          -> failwith "empty_list"  
             | Cons(x,_)      -> x  
  
let rec from n = Cons(n,from(n+1))
```

Custom Lazy Lists – 1st Iteration (cont'd)

Problem

```
# hd(from 0);;  
Stack overflow ...
```

Custom Lazy Lists – 1st Iteration (cont'd)

Problem

```
# hd(from 0);;  
Stack overflow ...
```

Idea

- block computation of *tail*, until explicitly requested

Custom Lazy Lists – 1st Iteration (cont'd)

Problem

```
# hd(from 0);;  
Stack overflow ...
```

Idea

- block computation of *tail*, until explicitly requested
- use `unit` function (i.e., of type `unit -> ...`)

Custom Lazy Lists – 2nd Iteration

Type

```
type 'a llist = Nil | Cons of ('a * (unit -> 'a llist))
```


Custom Lazy Lists – 2nd Iteration

Type

```
type 'a llist = Nil | Cons of ('a * (unit -> 'a llist))
```

Example

```
Nil                                     ([  
Cons(1, fun () -> Nil)                 ([1]  
Cons(2, fun () -> Cons(1, fun () -> Nil)) ([2;1]))
```

Custom Lazy Lists – 2nd Iteration

Type

```
type 'a llist = Nil | Cons of ('a * (unit -> 'a llist))
```

Example

```
Nil                                     ([  
Cons(1, fun () -> Nil)                 ([1]  
Cons(2, fun () -> Cons(1, fun () -> Nil)) ([2;1]))
```

Functions

```
let hd = function Nil           -> failwith "empty_list"  
          | Cons(x,_) -> x  
  
let tl = function Nil           -> failwith "empty_list"  
          | Cons(_,xs) -> xs ()  
  
let rec from n = Cons(n,fun() -> from(n+1))
```

Custom Lazy Lists – 2nd Iteration (cont'd)

Now

```
# hd(from 0);;  
- : int = 0  
  
# hd(tl(from 0));;  
- : int = 1
```

Custom Lazy Lists – 2nd Iteration (cont'd)

Now

```
# hd(from 0);;
- : int = 0

# hd(tl(from 0));;
- : int = 1
```

But

- strange that *tail* of `l1ist` is not `l1ist` itself

Custom Lazy Lists – 2nd Iteration (cont'd)

Now

```
# hd(from 0);;
- : int = 0

# hd(tl(from 0));;
- : int = 1
```

But

- strange that *tail* of `llist` is not `llist` itself
- use a mutually recursive type

Custom Lazy Lists – 3rd Iteration (module UnitList)

Type

```
type 'a cell = Nil | Cons of ('a * 'a llist)
and 'a llist = (unit -> 'a cell)
```

Custom Lazy Lists – 3rd Iteration (module UnitList)

Type

```
type 'a cell = Nil | Cons of ('a * 'a llist)
and 'a llist = (unit -> 'a cell)
```

Example

```
fun () -> Nil                                ([])
fun () -> Cons(1, fun () -> Nil)             ([1])
fun () -> Cons(2, fun () -> Cons(1, fun () -> Nil)) ([2;1])
```

Custom Lazy Lists – 3rd Iteration (module UnitList cont'd)

Functions

```
let hd xs = match xs() with Nil      -> failwith "empty"
                | Cons(x,_) -> x
```


Custom Lazy Lists – 3rd Iteration (module UnitList cont'd)

Functions

```
let hd xs = match xs() with Nil      -> failwith "empty"
                | Cons(x,_) -> x

let rec from n = fun() -> Cons(n,from(n+1))
```

Custom Lazy Lists – 3rd Iteration (module UnitList cont'd)

Functions

```
let hd xs = match xs() with Nil          -> failwith "empty"
                | Cons(x,_) -> x

let rec from n = fun() -> Cons(n,from(n+1))

let rec to_list n xs = if n < 1 then [] else match xs() with
  | Nil          -> []
  | Cons(x,xs) -> x :: to_list (n-1) xs
```

Custom Lazy Lists – 3rd Iteration (module UnitList cont'd)

Functions

```
let hd xs = match xs() with Nil          -> failwith "empty"
                | Cons(x,_) -> x

let rec from n = fun() -> Cons(n,from(n+1))

let rec to_list n xs = if n < 1 then [] else match xs() with
  | Nil          -> []
  | Cons(x,xs) -> x :: to_list (n-1) xs
```

Example

```
# from 0;;
- : int llist = <fun>

# to_list 10 (from 0);;
- : int list = [0; 1; 2; 3; 4; 5; 6; 7; 8; 9]
```

Overview

- **Week 12 - Laziness**
 - Summary of Weeks 10 & 11
 - Lazy Lists
 - **Fibonacci Numbers**
 - The Sieve of Eratosthenes



Recall

Definition (i -th Fibonacci number F_i)

$$F_i = \begin{cases} 0 & \text{if } i = 0 \\ 1 & \text{if } i = 1 \\ F_{i-1} + F_{i-2} & \text{otherwise} \end{cases}$$

Recall

Definition (i -th Fibonacci number F_i)

$$F_i = \begin{cases} 0 & \text{if } i = 0 \\ 1 & \text{if } i = 1 \\ F_{i-1} + F_{i-2} & \text{otherwise} \end{cases}$$

Sequence

0 1 1 2 3 5 8 13 21 34 55 89 144 233 377 610 987 1597 2584 ...

Idea

Visualization

starting at 0 | 0 1

Idea

Visualization

starting at 0		0	1
starting at 1		1	

Idea

Visualization

starting at 0		0	1
starting at 1		1	
(+)			

Idea

Visualization

starting at 0		0	1
starting at 1		1	
(+)			

Idea

Visualization

starting at 0		0	1
starting at 1		1	
(+)		1	

Idea

Visualization

starting at 0		0	1	1
starting at 1		1	1	
(+)		1		

Idea

Visualization

starting at 0		0	1	1
starting at 1		1	1	
(+)		1		

Idea

Visualization

starting at 0		0	1	1
starting at 1		1	1	
(+)		1	2	

Idea

Visualization

starting at 0		0	1	1	2
starting at 1		1	1	2	
(+)		1	2		

Idea

Visualization

starting at 0		0	1	1	2
starting at 1		1	1	2	
(+)		1	2		

Idea

Visualization

starting at 0		0	1	1	2
starting at 1		1	1	2	
(+)		1	2	3	

Idea

Visualization

starting at 0		0	1	1	2	3
starting at 1		1	1	2	3	
(+)		1	2	3		

Idea

Visualization

starting at 0		0	1	1	2	3
starting at 1		1	1	2	3	
(+)		1	2	3		

Idea

Visualization

starting at 0		0	1	1	2	3
starting at 1		1	1	2	3	
(+)		1	2	3	5	

Idea

Visualization

starting at 0		0	1	1	2	3	5
starting at 1		1	1	2	3	5	
(+)		1	2	3	5		

Idea

Visualization

starting at 0	0	1	1	2	3	5
starting at 1	1	1	2	3	5	
(+)	1	2	3	5		

Idea

Visualization

starting at 0	0	1	1	2	3	5
starting at 1	1	1	2	3	5	
(+)	1	2	3	5	8	

Idea

Visualization

starting at 0	0	1	1	2	3	5	8
starting at 1	1	1	2	3	5	8	
(+)	1	2	3	5	8		

Idea

Visualization

starting at 0	0	1	1	2	3	5	8
starting at 1	1	1	2	3	5	8	
(+)	1	2	3	5	8		

Idea

Visualization

starting at 0	0	1	1	2	3	5	8
starting at 1	1	1	2	3	5	8	
(+)	1	2	3	5	8	13	

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13
starting at 1	1	1	2	3	5	8	13	
(+)	1	2	3	5	8	13		

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13
starting at 1	1	1	2	3	5	8	13	
(+)	1	2	3	5	8	13		

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13
starting at 1	1	1	2	3	5	8	13	
(+)	1	2	3	5	8	13	21	

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13	21
starting at 1	1	1	2	3	5	8	13	21	
(+)	1	2	3	5	8	13	21		

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13	21
starting at 1	1	1	2	3	5	8	13	21	
(+)	1	2	3	5	8	13	21		

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13	21
starting at 1	1	1	2	3	5	8	13	21	
(+)	1	2	3	5	8	13	21	34	

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13	21	...
starting at 1	1	1	2	3	5	8	13	21	...	
(+)	1	2	3	5	8	13	21	34	...	

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13	21	...
starting at 1	1	1	2	3	5	8	13	21	...	
(+)	1	2	3	5	8	13	21	34	...	

Missing

- function to shift sequence to the left
- function to add two sequences

Idea

Visualization

starting at 0	0	1	1	2	3	5	8	13	21	...
starting at 1	1	1	2	3	5	8	13	21	...	
(+)	1	2	3	5	8	13	21	34	...	

Missing

- function to shift sequence to the left → `tl`
- function to add two sequences → `zip_with (+)`

Implementation (in module UnitList)

```
let tl xs = match xs() with Nil          -> failwith "empty"
                | Cons(_,xs) -> xs

let rec zip_with f xs ys = fun() -> match (xs(),ys()) with
  | (Cons(x,xs),Cons(y,ys)) -> Cons(f x y,zip_with f xs ys)
  | _                        -> Nil

let rec fibs =
  fun() -> Cons(0,fun() -> Cons(1, zip_with (+) fibs (tl fibs)))
```

Implementation (in module UnitList)

```
let tl xs = match xs() with Nil          -> failwith "empty"
                | Cons(_,xs) -> xs

let rec zip_with f xs ys = fun() -> match (xs(),ys()) with
  | (Cons(x,xs),Cons(y,ys)) -> Cons(f x y,zip_with f xs ys)
  | _                        -> Nil

let rec fibs =
  fun() -> Cons(0,fun() -> Cons(1, zip_with (+) fibs (tl fibs)))
```

Example

```
# to_list 10 fibs
- : int list = [0; 1; 1; 2; 3; 5; 8; 13; 21; 34]
```

Problem

Lazy Enough?

- we defer computation (i.e., call-by-name evaluation) ✓

Problem

Lazy Enough?

- we defer computation (i.e., call-by-name evaluation) ✓
- we do not use **memoization** ✗

Problem

Lazy Enough?

- we defer computation (i.e., call-by-name evaluation) ✓
- we do not use memoization ✗

Memoization

- prohibit recomputation of same expressions

Problem

Lazy Enough?

- we defer computation (i.e., call-by-name evaluation) ✓
- we do not use memoization ✗

Memoization

- prohibit recomputation of same expressions
- built-in in OCaml's support for laziness

Overview

- Week 12 - Laziness
 - Summary of Weeks 10 & 11
 - Lazy Lists
 - Fibonacci Numbers
 - The Sieve of Eratosthenes



Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into **lazy** expression

Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into **lazy** expression

Example

Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into `lazy` expression

Example

- `let e = lazy(print_string "test\n")`

Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into `lazy` expression

Example

- `let e = lazy(print_string "test\n")`
- `let f = lazy(let rec f() = print_int 1;f() in f())`

Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into `lazy` expression

Example

- `let e = lazy(print_string "test\n")`
- `let f = lazy(let rec f() = print_int 1;f() in f())`

Function `Lazy.force`

used to `evaluate` lazy expressions

Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into **lazy** expression

Example

- `let e = lazy(print_string "test\n")`
- `let f = lazy(let rec f() = print_int 1;f() in f())`

Function `Lazy.force`

used to **evaluate** lazy expressions

Example

- `Lazy.force e`

Lazyness in OCaml

Keyword `lazy`

used to transform arbitrary expression into **lazy** expression

Example

- `let e = lazy(print_string "test\n")`
- `let f = lazy(let rec f() = print_int 1;f() in f())`

Function `Lazy.force`

used to **evaluate** lazy expressions

Example

- `Lazy.force e`
- `Lazy.force f`

Lazy Lists Again (module LazyList)

Type

```
type 'a t    = 'a cell Lazy.t  
and 'a cell = Nil | Cons of ('a * 'a t)
```

Lazy Lists Again (module LazyList)

Type

```
type 'a t    = 'a cell Lazy.t
and 'a cell = Nil | Cons of ('a * 'a t)
```

Example

```
lazy Nil                ([[]])
lazy (Cons(1, lazy Nil)) ([1])
lazy (Cons(2, lazy (Cons(1, lazy Nil)))) ([2;1])
```

The Sieve of Eratosthenes (module LazyList)

Algorithm

start with list of all natural numbers (from 2 on)

1. mark first element h as prime
2. remove all multiples of h
3. goto Step 1

The Sieve of Eratosthenes (module LazyList)

Algorithm

start with list of all natural numbers (from 2 on)

1. mark first element h as prime
2. remove all multiples of h
3. goto Step 1

Functions

```
let fc = Lazy.force
```

The Sieve of Eratosthenes (module LazyList)

Algorithm

start with list of all natural numbers (from 2 on)

1. mark first element h as prime
2. remove all multiples of h
3. goto Step 1

Functions

```
let fc = Lazy.force
```

```
let rec from n = lazy(Cons(n,from(n+1)))
```

The Sieve of Eratosthenes (module LazyList)

Algorithm

start with list of all natural numbers (from 2 on)

1. mark first element h as prime
2. remove all multiples of h
3. goto Step 1

Functions

```
let fc = Lazy.force
```

```
let rec from n = lazy(Cons(n,from(n+1)))
```

```
let rec to_list n xs = if n < 1 then [] else match fc xs with  
| Nil          -> []  
| Cons(x,xs)  -> x :: to_list (n-1) xs
```

The Sieve of Eratosthenes (module LazyList cont'd)

```
let rec filter p xs = lazy(match fc xs with
  | Nil          -> Nil
  | Cons(x,xs)  -> if p x then Cons(x,filter p xs)
                   else fc(filter p xs)
)
```


The Sieve of Eratosthenes (module LazyList cont'd)

```
let rec filter p xs = lazy(match fc xs with
  | Nil          -> Nil
  | Cons(x,xs)  -> if p x then Cons(x,filter p xs)
                   else fc(filter p xs)
)
```

```
let rec sieve xs = lazy(match fc xs with
  | Nil          -> Nil
  | Cons(x,xs)  ->
    Cons(x,sieve(filter (fun y -> y mod x <> 0) xs))
)
```

The Sieve of Eratosthenes (module LazyList cont'd)

```
let rec filter p xs = lazy(match fc xs with
  | Nil          -> Nil
  | Cons(x,xs)  -> if p x then Cons(x,filter p xs)
                   else fc(filter p xs)
)
```

```
let rec sieve xs = lazy(match fc xs with
  | Nil          -> Nil
  | Cons(x,xs)  ->
    Cons(x,sieve(filter (fun y -> y mod x <> 0) xs))
)
```

```
let primes = sieve(from 2)
```