## CS450

### Structure of Higher Level Languages

Lecture 11: Infinite streams

Tiago Cogumbreiro

Press arrow keys  $\vdash$   $\rightarrow$  to change slides.

# Infinite streams

### Stream

A stream is an infinite sequence of values.

For example, how would you represent the set of  ${\cal N}$  natural numbers in a program?

$$1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 6 \rightarrow 7 \rightarrow \cdots$$

#### **Did you know?** The concept of streams is also used in:

- Reactive programming (eg, a stream of GUI events for Android development)
- Stream processing for digital signal processing (eg, image/video codecs with the language StreamIt)
- Unix pipes (eg, a pipeline of Unix process producing and consuming a stream of data)
- See also Microsoft LINQ and Java 8 streams



# Streams in TypedRacket

```
(define-type (stream T)
  ; A thunk that returns a stream-add
  (-> (stream-add T))
)
(struct [T] stream-add (
  ; Holds an element
  [first : T]
  ; And a thunk to another stream of T
  [rest : (stream T)]
  )
)
```

- A stream of type T is an infinite "linkedlist" whose elements have type T
- We encode the notion of infinitude with delayed-construction of the elements on the list
- Here: stream is a thunk. that holds a stream-add, that holds a stream
- I like to imagine a stream as a datastructure equivalent of Ouroboros





# Streams in (Typed) Racket

A stream can be recursively defined as a a pair holds a value and another stream stream = (thunk (stream-add some-value stream)

Powers of two

```
(thunk (stream-add 1 (thunk (stream-add 2 (thunk (stream-add 4 (thunk ...)))))
Visually
1 2 4 ...
```



# Using streams

```
(match (powers-of-two); 1. A stream is a thunk; call to build the first element
 [(stream-add x s); 2. Inside the thunk there is a stream-add
   (displayln x) ; 3. Output the first element: 1
   (match (s); 4. Construct the second element
     [(stream-add y s)
       (check-equal? y 2); 5. Output the 2nd element: 2
       (match (s); 6. Call and match the 3rd element
         [(stream-add z _)
           (check-equal z 4); 7. Output the 3rd element: 4
```



# Generalize sampling the first 3 elements

```
(: sample3 (All [T] (-> (stream T) (Listof T))))
(define (sample3 s)
 (match (s)
   [(stream-add x1 s)
      (match (s)
        [(stream-add x2 s)
          (match (s)
            [(stream-add x3 _)
              (list x1 x2 x3)
(sample3 powers-of-two)
; '(1 2 4)
```



# Count elements in stream

## Programming with streams

Let us write a function that given a stream and a predicate, counts how many times a predicate holds true until it becomes false.

```
(: count-until
  (A11 \mid T)
    (->
      ; Given a predicate
      (-> T Boolean)
      : Take a stream
      (stream T)
      ; How many elements
      Number
```

#### Spec

```
(count-until (lambda ([x : Number]) (< (cast x Real) 8)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambda ([x : Number]) (<= (cast x Real) 0)) position is a second count-until (lambd
```



## Solution

```
(define (count-until pred s)
  (: count-until-iter (-> Number (stream T) Number)
  (define (count-until-iter count s)
    (match (s)
      ; If the predicate holds on x
      \lceil (stream-add \times s) \rceil
        (if (pred x)
          ; loop: increment count in next iter
          (count-until-iter (+ count 1) s)
          ; return count
          count
  (count-until-iter 0 s))
```

- Make sure we write match (s) to let the stream build the first element
- Pattern-matching helps us retrieve the element built and the rest of the stream

```
def count_until(pred, s):
    count = 0
    while True:
        (x, s) = s() # similar to match
        if pred(x):
            count += 1
            # loop = rec call
        else:
            return count
```

# Implementing powers of two

# Example: powers of two

Implement (: powers-of-two (stream Number))



# Example: powers of two

Implement (: powers-of-two (stream Number))

#### Solution

```
(: powers-of-two (stream Number))
(define (powers-of-two)
  (: powers-of-two-iter (-> Number (stream Number)))
  (define (powers-of-two-iter n)
      (thunk (stream-add n (powers-of-two-iter (* 2 n)))))
  ((powers-of-two-iter 1))
)
```



## Common mistake: forgot thunk

If you were to run this code, it would run into an infinite loop, as **recursion is not guarded**!



## Common mistake: forgot thunk

If you were to run this code, it would run into an infinite loop, as **recursion is not guarded**!

```
lecture11.rkt:56:4: Type Checker:
  Polymorphic function `stream-add'
  could not be applied to arguments:
Argument 1:
  Expected: T
  Given: Number
Argument 2:
  Expected: (-> (stream-add T))
  Given: (-> (stream-add Number))
Result type: (stream-add T)
Expected result: (-> (stream-add Number))
  in: (stream-add n
        (powers-of-two-iter (* 2 n)))
                                  Boston
```

# The stream of constants

# Example: constant

Implement a function const that given a value it returns a stream that always yields that value: (: const (-> Number (stream Number)))

```
(sample3 (const 20)); '(20 20 20)
```



## Solution

```
(: const (-> Number (stream Number)))
(define (const v)
  (thunk (stream-add v (const v))))
```



# The stream of natural numbers

## Streams in Racket

A stream can be recursively defined as a a pair holds a value and another stream stream = (thunk (stream-add some-value stream))

A stream of natural numbers

```
(thunk (stream-add 0 (thunk (stream-add 1 (thunk (stream-add 2 (thunk ...)))))
```

Visually

```
0 1 2 3 4 5 6 ...
```

The type of naturals is a stream of numbers:

```
(: naturals (stream Number))
```



### Natural numbers

Implement the stream of non-negative integers

```
0 1 2 3 4 5 6 7 ...
Solution
```



# The map stream

# Map for streams

Given a stream s defined as

```
e0 e1 e2 e3 e4 ...
```

and a function f the stream (stream-map f s) should yield

```
(f e0) (f e1) (f e2) (f e3) (f e4) ...
```



## Map for streams

### Spec

```
(: stream-map
  (All [InputElem OutputElem]
    (->
      ; Can convert an InputElem into an OutputElem
      (-> InputElem OutputElem)
      ; Given a stream of InputElem
      (stream InputElem)
      ; Generate a stream of OutputElem
      (stream OutputElem)
```



## Map for streams

### Spec

```
(: stream-map
  (All [InputElem OutputElem]
    (->
      ; Can convert an InputElem into an OutputElem
      (-> InputElem OutputElem)
      ; Given a stream of InputElem
      (stream InputElem)
      ; Generate a stream of OutputElem
      (stream OutputElem)
```

#### Solution

```
(define (stream-map f s)
 (thunk ; <- very important!</pre>
  (match (s); <- delayed match
   [(stream-add x s)]
    (stream-add
      (f x); replace x by (f x)
      (stream-map f s)
```



## Eager-match makes can trigger errors

#### **INCORRECT**

```
(define (stream-map f s)
  (match (s); <- An INCORRECT eager match
  [(stream-add x s)
     (thunk (stream-add (f x) (stream-map f s))
  ])))</pre>
```

#### CORRECT

```
(define (stream-map f s)
  (thunk ; <- thunk BEFORE match
      (match (s)
       [(stream-add x s)
            (stream-add (f x) (stream-map f s))])))</pre>
```

- An important point of streams is to delay execution as much as possible
- In this incorrect example we match before the thunk
- A user invoking (stream-map f s), builds the first element of s, which is surprising and undesirable
- In the correctness tests of HW4, we will test for eagerness



# The stream of even numbers

## Even naturals

Build a stream of even numbers. Tip: use stream-map and naturals.

0 2 4 6 8 10 12 ...



## Even naturals

Build a stream of even numbers. Tip: use stream-map and naturals.



# Merge two streams

# Zip two streams

Given a stream s1 defined as

```
e1 e2 e3 e4 ...
```

and a stream s2 defined as

```
f1 f2 f3 f4 ...
```

the stream (stream-zip s1 s2) returns

```
(cons e1 f1) (cons e2 f2) (cons e3 f3) (cons e4 f4) ...
```



# Zip for streams

### Spec

```
#lang racket
(require rackunit)
(define s0
  (stream-zip (naturals) (even-naturals))
(check-equal? (stream-get s0) (cons 0 0))
(define s1 (stream-next s0))
(check-equal? (stream-get s1) (cons 1 2))
(define s2 (stream-next s1))
(check-equal? (stream-get s2) (cons 2 4))
```



## Zip for streams

### Spec

```
#lang racket
(require rackunit)
(define s0
  (stream-zip (naturals) (even-naturals))
(check-equal? (stream-get s0) (cons 0 0))
(define s1 (stream-next s0))
(check-equal? (stream-get s1) (cons 1 2))
(define s2 (stream-next s1))
(check-equal? (stream-get s2) (cons 2 4))
```

#### Solution



# Exercises on streams

# Zip two streams

Given a stream s1 defined as

```
e1 e2 e3 e4 ...
```

and a stream s2 defined as

```
f1 f2 f3 f4 ...
```

the stream (stream-zip s1 s2) returns

```
(cons e1 f1) (cons e2 f2) (cons e3 f3) (cons e4 f4) ...
```



## Enumerate a stream

Build a stream from a given stream s defined as

```
e0 e1 e2 e3 e4 e5 ...
```

the stream (stream-enum s) returns

```
(cons 0 e0) (cons 1 e1) (cons 2 e2) (cons 3 e3) (cons 4 e4) (cons 5 e5) ...
```



## Enumerate a stream

### Spec

```
#lang racket
(require rackunit)

(define s0 (stream-enum (even-naturals)))
(check-equal? (stream-get s0) (cons 0 0))

(define s1 (stream-next s0))
(check-equal? (stream-get s1) (cons 1 2))

(define s2 (stream-next s1))
(check-equal? (stream-get s2) (cons 2 4))
```



### Enumerate a stream

### Spec

```
#lang racket
(require rackunit)

(define s0 (stream-enum (even-naturals)))
(check-equal? (stream-get s0) (cons 0 0))

(define s1 (stream-next s0))
(check-equal? (stream-get s1) (cons 1 2))

(define s2 (stream-next s1))
(check-equal? (stream-get s2) (cons 2 4))
```

#### Solution

```
(define (stream-enum s)
  (stream-zip (naturals) s))
```



# Filter

How would a filter work with streams?

## Filter

### Spec



# Converting filter to stream-filter

```
: List version
 (define (filter to-keep? 1)
   (cond
   [(empty? 1) 1]
   [(to-keep? (first 1))
    (cons (first 1)
           (filter to-keep? (rest 1)))]
   [else (filter to-keep? (rest 1))]))
; Stream-version
 (define (stream-filter to-keep? s)
   (cond
     ; <- no base case; streams are infinite
     [(to-keep? (stream-get s)); <- first becomes stream-get
      (cons (stream-get s)
             ; Second element is always a thunk
             (thunk (stream-filter to-keep? (stream-next s))))]
                                                                                  Boston
      [else (stream-filter to-keep? (stream-next s))])); rest becomes stream-next
```

# Drop every other element

Given a stream defined below, drop every other element from the stream. That is, given a stream s defined as...

```
e0 e1 e2 e3 e4 ...

stream (stream-drop-1 s) returns
e0 e2 e4 ...
```



## Drop every other element...

### Spec

```
#lang racket
(require rackunit)

(define s0 (stream-drop-1 (naturals)))
(check-equal? (stream-get s0) 0)

(define s1 (stream-next s0))
(check-equal? (stream-get s1) 2)

(define s2 (stream-next s1))
(check-equal? (stream-get s2) 4)
```



## Drop every other element...

### Spec

```
#lang racket
(require rackunit)

(define s0 (stream-drop-1 (naturals)))
(check-equal? (stream-get s0) 0)

(define s1 (stream-next s0))
(check-equal? (stream-get s1) 2)

(define s2 (stream-next s1))
(check-equal? (stream-get s2) 4)
```

#### Solution

```
(define (stream-drop-1 s)
 ; for each e yield (i, e)
  (define enum-s (stream-enum s))
 ; given (i, e) only keep (even? i)
  (define even-s
    (stream-filter
      (lambda (x) (even? (car x)))
      (compose even? car)
      enum-s))
  ; convert (i, e) back to e
  (stream-map cdr even-s))
```



## More exercises

- (stream-ref s n) returns the element in the n-th position of stream s
- (stream-interleave s1 s2) interleave each element of stream s1 with each element of s2
- (stream-merge f s1 s2) for each i-th element of stream s1 (say e1) and i-th element of stream s2 (say e2) return (f e1 e2)
- (stream-drop n s) ignore the first n elements from stream s
- (stream-take n s) returns the first n elements of stream s in a list in appearance order

