# Part I

# Introduction

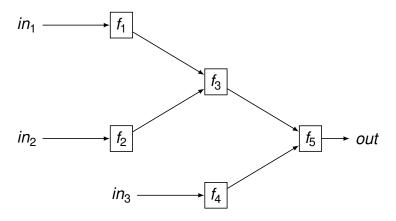


# Functional programming features

- Mathematical functions, as value transformers
- Functions as first-class values
- No side effects or state



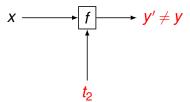
### Functional flow





## Stateful computation

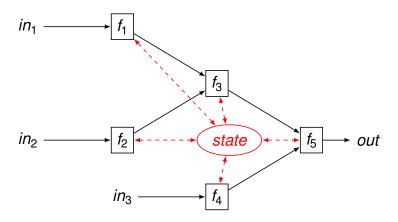
Output dependent on input and time:





### Functional flow

### **Impure**





# Functional programming features

- Mathematical functions, as value transformers
- Functions as first-class values
- No side effects or state
- Immutability
- Referential transparency
- Recursion
- Higher-order functions
- Lazy evaluation



# Why functional programming?

- Simple evaluation model; equational reasoning
- Declarative
- Modularity, composability, reuse (lazy evaluation as glue)
- Exploration of huge or formally infinite search spaces
- Embedded Domain Specific Languages (EDSLs)
- Massive parallelization
- Type systems and logic, inextricably linked
- Automatic program verification and synthesis



### Part II

# **Untyped Lambda Calculus**



# Untyped lambda calculus

- Model of computation Alonzo Church, 1932
- Equivalent to the Turing machine (see the Church-Turing thesis)
- Main building block: the function
- Computation: evaluation of function applications, through textual substitution
- Evaluate = obtain a value (a function)!
- No side effects or state



## **Applications**

Theoretical basis of numerous languages:

LISP

ML

Clojure

Scheme

► F#

Scala

Haskell

Clean

Erlang

 Formal program verification, due to its simple execution model



# $\lambda$ -expressions

### **Definition 4.1 (** $\lambda$ **-expression).**

- ▶ Variable: a variable x is a  $\lambda$ -expression
- Function: if x is a variable and E is a λ-expression, then λx.E is a λ-expression, which stands for an anonymous, unary function, with the formal parameter x and the body E
- ▶ Application: if E and A are  $\lambda$ -expressions, then (E A) is a  $\lambda$ -expression, which stands for the application of the expression E onto the actual argument A.



# $\lambda$ -expressions

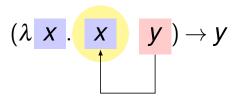
Examples

### Example 4.2 ( $\lambda$ -expressions).

- ▶  $x \rightarrow \text{variable } x$
- $\rightarrow \lambda x.x$ : the identity function
- $\rightarrow \lambda x.\lambda y.x$ : a function with another function as body!
- (λx.x y): the application of the identity function onto the actual argument y
- $\qquad \qquad (\lambda X.(X\ X)\ \lambda X.X)$



## Intuition on application evaluation





### Variable occurrences

**Definitions** 

### **Definition 4.3 (Bound occurrence).**

An occurrence  $x_n$  of a variable x is bound in the expression E iff:

- $\triangleright$   $E = \lambda x.F$  or
- $\blacktriangleright$   $E = \dots \lambda x_n . F \dots$  or
- ▶  $E = \dots \lambda x.F \dots$  and  $x_n$  appears in F.

### Definition 4.4 (Free occurrence).

A variable occurrence is free in an expression iff it is not bound in that expression.

Bound/ free occurrence w.r.t. a given expression!



### Variable occurrences

#### Examples

### Example 4.6 (Bound and free variables).

In the expression  $E = (\lambda x. \lambda z. (z \ x) \ (z \ y))$ , we emphasize the occurrences of x, y, z:

$$E = (\lambda x_1 . \lambda z_1 . (z_2 x_2) (z_3 y_1)).$$

- ► *x*<sub>1</sub>, *x*<sub>2</sub>, *z*<sub>1</sub>, *z*<sub>2</sub> bound in *E*
- y<sub>1</sub>, z<sub>3</sub> free in E
- $\triangleright$   $z_1$ ,  $z_2$  bound in F
- ► x<sub>2</sub> free in F



# Variables

**Definitions** 

### Definition 4.7 (Bound variable).

A variable is bound in an expression iff all its occurrences are bound in that expression.

### **Definition 4.8 (Free variable).**

A variable is free in an expression iff it is not bound in that expression i.e., iff at least one of its occurrences is free in that expression.

Bound/ free variable w.r.t. a given expression!



### Variable occurrences

#### Examples

### Example 4.6 (Bound and free variables).

In the expression  $E = (\lambda x. \lambda z. (z \ x) \ (z \ y))$ , we emphasize the occurrences of x, y, z:

$$E = (\lambda x_1 . \lambda z_1 . (z_2 x_2) (z_3 y_1)).$$

- ► x<sub>1</sub>, x<sub>2</sub>, z<sub>1</sub>, z<sub>2</sub> bound in E
- y<sub>1</sub>, z<sub>3</sub> free in E
- $\triangleright$   $z_1, z_2$  bound in F
- x<sub>2</sub> free in F
- x bound in E, but free in F
- y free in E
- ► z free in E, but bound in F



### Free and bound variables

### Free variables

- ▶  $FV(x) = \{x\}$
- $FV(\lambda x.E) = FV(E) \setminus \{x\}$
- ►  $FV((E_1 \ E_2)) = FV(E_1) \cup FV(E_2)$

### **Bound variables**

- $\blacktriangleright BV(x) = \emptyset$
- $BV(\lambda x.E) = BV(E) \cup \{x\}$
- $\blacktriangleright BV((E_1 \ E_2)) = BV(E_1) \setminus FV(E_2) \cup BV(E_2) \setminus FV(E_1)$



# Closed expressions

### **Definition 4.9 (Closed expression).**

An expression that does not contain any free variables.

### Example 4.10 (Closed expressions).

- $(\lambda x.x \ \lambda x.\lambda y.x)$  : closed
- $(\lambda x.x \ a)$ : open, since a is free

#### Remarks:

- Free variables may stand for other  $\lambda$ -expressions, as in  $\lambda x.((+x) \ 1)$ .
- Before evaluation, an expression must be brought to the closed form.
- ► The substitution process must terminate.



# β-reduction Definitions

### Definition 5.1 ( $\beta$ -reduction).

The evaluation of the application ( $\lambda x.E$  A), by substituting every free occurrence of the <u>formal</u> argument, x, in the function body, E, with the <u>actual</u> argument, A: ( $\lambda x.E$  A)  $\rightarrow_{\beta} E_{[A/x]}$ .

### **Definition 5.2** ( $\beta$ -redex).

The application ( $\lambda x.E A$ ).



# $\beta$ -reduction Examples

### Example 5.3 ( $\beta$ -reduction).

- $(\lambda x. x y) \rightarrow_{\beta} x_{[y/x]} \rightarrow y$
- $(\lambda x. \lambda x. x y) \rightarrow_{\beta} \lambda x. x_{[y/x]} \rightarrow \lambda x. x$
- $(\lambda x. \lambda y. x \ y) \rightarrow_{\beta} \lambda y. x_{[y/x]} \rightarrow \lambda y. y$

Wrong! The free variable *y* becomes bound, changing its meaning!



# β-reduction Collisions

- ▶ Problem: within the expression ( $\lambda x.E$  A):
  - ▶  $FV(A) \cap BV(E) = \emptyset \Rightarrow$  correct reduction always
  - ►  $FV(A) \cap BV(E) \neq \emptyset \Rightarrow$  potentially wrong reduction
- Solution: rename the bound variables in E, that are free in A

### Example 5.4 (Bound variable renaming).

$$(\lambda x.\lambda y.x \ y) \rightarrow (\lambda x.\lambda z.x \ y) \rightarrow_{\beta} \lambda z.x_{[y/x]} \rightarrow \lambda z.y$$



# $\alpha$ -conversion

Definition

# Definition 5.5 ( $\alpha$ -conversion).

Systematic relabeling of bound variables in a function:  $\lambda x.E \rightarrow_{\alpha} \lambda y.E_{[y/x]}$ . Two conditions must be met.

### Example 5.6 ( $\alpha$ -conversion).

- ▶  $\lambda x.y \rightarrow_{\alpha} \lambda y.y_{[y/x]} \rightarrow \lambda y.y$ : Wrong!
- ▶  $\lambda x.\lambda y.x \rightarrow_{\alpha} \lambda y.\lambda y.x_{[y/x]} \rightarrow \lambda y.\lambda y.y$ : Wrong!

#### Conditions:

- y is not free in E
- ▶ a free occurrence in E stays free in E<sub>[y/x]</sub>



### $\alpha$ -conversion

#### Examples

### Example 5.7 ( $\alpha$ -conversion).

- ▶  $\lambda x.(x \ y) \rightarrow_{\alpha} \lambda z.(z \ y)$  : Correct!
- ▶  $\lambda x.\lambda x.(x \ y) \rightarrow_{\alpha} \lambda y.\lambda x.(x \ y)$ : Wrong! y is free in  $\lambda x.(x \ y)$ .
- ►  $\lambda x.\lambda y.(y \ x) \rightarrow_{\alpha} \lambda y.\lambda y.(y \ y)$ : Wrong! The free occurrence of x in  $\lambda y.(y \ x)$  becomes bound, after substitution, in  $\lambda y.(y \ y)$ .
- ▶  $\lambda x.\lambda y.(y \ y) \rightarrow_{\alpha} \lambda y.\lambda y.(y \ y)$  : Correct!



# Reduction

**Definitions** 

### **Definition 5.8 (Reduction step).**

A sequence made of a possible  $\alpha$ -conversion, followed by a  $\beta$ -reduction, such that the second produces no collisions:  $E_1 \to E_2 \equiv E_1 \to_{\alpha} E_3 \to_{\beta} E_2$ .

### **Definition 5.9 (Reduction sequence).**

A string of zero or more reduction steps:  $E_1 \rightarrow^* E_2$ . It is an element of the reflexive transitive closure of relation  $\rightarrow$ .



### Reduction

#### Examples

### Example 5.10 (Reduction).

- $((\lambda x.\lambda y.(y \ x) \ y) \ \lambda x.x) \to^* y$



### Reduction

#### **Properties**

Reduction step = reduction sequence:

$$E_1 \to E_2 \Rightarrow E_1 \to^* E_2$$

Reflexivity:

$$E \rightarrow^* E$$

Transitivity:

$$E_1 \rightarrow^* E_2 \, \wedge \, E_2 \rightarrow^* E_3 \Rightarrow E_1 \rightarrow^* E_3$$



### Questions

When does the computation terminate?
 Does it always?

2. Does the answer depend on the reduction sequence?

3. If the computation terminates for distinct reduction sequences, do we always get the same result?

4. If the result is unique, how do we safely obtain it?

### Normal forms

### **Definition 6.1 (Normal form).**

The form of an expression that cannot be reduced i.e., that contains no  $\beta$ -redexes.

### **Definition 6.2 (Functional normal form, FNF).**

 $\lambda x.E$ , even if *E* contains  $\beta$ -redexes.

### **Example 6.3 (Normal forms).**

$$(\lambda x.\lambda y.(x\ y)\ \lambda x.x) \rightarrow_{\mathsf{FNF}} \lambda y.(\lambda x.x\ y) \rightarrow_{\mathsf{NF}} \lambda y.y$$

FNF is used in programming, where the function body is evaluated only when the function is effectively applied.



# Reduction termination (reducibility)

### Example 6.4.

$$\Omega \equiv (\lambda X.(X\ X)\ \lambda X.(X\ X)) \rightarrow (\lambda X.(X\ X)\ \lambda X.(X\ X)) \rightarrow^* \dots$$

 $\Omega$  does not have a terminating reduction sequence.

### **Definition 6.5 (Reducible expression).**

An expression that has a terminating reduction sequence.

 $\Omega$  is irreducible.



### Questions

When does the computation terminate?
 Does it always?

2. Does the answer depend on the reduction sequence?

3. If the computation terminates for distinct reduction sequences, do we always get the same result?

4. If the result is unique, how do we safely obtain it?

### Reduction sequences

### Example 6.6 (Reduction sequences).

- ► E has a nonterminating reduction sequence, but still has a normal form, y. E is reducible,  $\Omega$  is not.
- ► The length of terminating reduction sequences is unbounded.

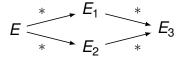


# Normal form uniqueness

Results

### Theorem 6.7 (Church-Rosser / diamond).

If  $E \to^* E_1$  and  $E \to^* E_2$ , then there is an  $E_3$  such that  $E_1 \to^* E_3$  and  $E_2 \to^* E_3$ .



### Corollary 6.8 (Normal form uniqueness).

If an expression is reducible, its normal form is unique. It corresponds to the value of that expression.



# Normal form uniqueness

Examples

### **Example 6.9 (Normal form uniqueness).**

$$(\lambda x.\lambda y.(x\ y)\ (\lambda x.x\ y))$$

- $\blacktriangleright \rightarrow \lambda Z.((\lambda X.X \ y) \ Z) \rightarrow \lambda Z.(y \ Z) \rightarrow_{\alpha} \lambda a.(y \ a)$
- $\blacktriangleright \rightarrow (\lambda x.\lambda y.(x\ y)\ y) \rightarrow \lambda w.(y\ w) \rightarrow_{\alpha} \lambda a.(y\ a)$

- Normal form: class of expressions, equivalent under systematic relabeling
- Value: distinguished member of this class



## Structural equivalence

### **Definition 6.10 (Structural equivalence).**

Two expressions are structurally equivalent iff they both reduce to the <u>same</u> expression.

### Example 6.11 (Structural equivalence).

 $\lambda z.((\lambda x.x \ y) \ z)$  and  $(\lambda x.\lambda y.(x \ y) \ y)$  in Example 6.9.



## Computational equivalence

### Definition 6.12 (Computational equivalence).

Two expressions are computationally equivalent iff they the behave in the same way when applied onto the same arguments.

### Example 6.13 (Computational equivalence).

$$E_1 = \lambda y.\lambda x.(y x)$$
$$E_2 = \lambda x.x$$

- ►  $((E_1 \ a) \ b) \to^* (a \ b)$
- ►  $((E_2 \ a) \ b) \to^* (a \ b)$
- ▶  $E_1 \not\rightarrow^* E_2$  and  $E_2 \not\rightarrow^* E_1$  (not structurally equivalent)



#### Reduction order

Definitions and examples

#### **Definition 6.14 (Left-to-right reduction step).**

The reduction of the outermost leftmost  $\beta$ -redex.

### **Example 6.15 (Left-to-right reduction).**

$$(\underline{(\lambda x.x\ \lambda x.y)}\ (\lambda x.(x\ x)\ \lambda x.(x\ x))) \to \underline{(\lambda x.y\ \Omega)} \to y$$

### Definition 6.16 (Right-to-left reduction step).

The reduction of the innermost rightmost  $\beta$ -redex.

### Example 6.17 (Right-to-left reduction).

$$((\lambda X.X \ \lambda X.y) \ (\lambda X.(X \ X) \ \lambda X.(X \ X))) \rightarrow (\lambda X.y \ \underline{\Omega}) \rightarrow \dots$$



#### Questions

- When does the computation terminate?
   Does it always?
  - NO
- 2. Does the answer depend on the reduction sequence?
  - YES
- 3. If the computation terminates for distinct reduction sequences, do we always get the same result?
  - YES
- 4. If the result is unique, how do we safely obtain it?
  - Left-to-right reduction



#### **Evaluation order**

### **Definition 7.1 (Applicative-order evaluation).**

Corresponds to right-to-left reduction. Function arguments are evaluated before the function is applied.

### **Definition 7.2 (Strict function).**

A function that uses applicative-order evaluation.

### **Definition 7.3 (Normal-order evaluation).**

Corresponds to left-to-right reduction. Function arguments are evaluated when needed.

### **Definition 7.4 (Non-strict function).**

A function that uses normal-order evaluation.



### In practice I

Applicative-order evaluation employed in most programming languages, due to efficiency — one-time evaluation of arguments: C, Java, Scheme, PHP, etc.

# Example 7.5 (Applicative-order evaluation in Scheme).

$$((\lambda (x) (+ x x)) (+ 2 3))$$

$$\rightarrow ((\lambda (x) (+ x x)) 5)$$

$$\rightarrow (+ 5 5)$$

$$\rightarrow 10$$



### In practice II

Lazy evaluation (a kind of normal-order evaluation) in Haskell: on-demand evaluation of arguments, allowing for interesting constructions

### Example 7.6 (Lazy evaluation in Haskell).

$$\frac{((\x -> x + x) (2 + 3))}{\rightarrow (2 + 3)} + (2 + 3)}{\rightarrow 5 + 5} \\
\rightarrow 10$$

Need for non-strict functions, even in applicative languages: if, and, or, etc.



### Part III

# Lambda Calculus as a Programming Language



### Purpose

- Proving the expressive power of lambda calculus
- Hypothetical λ-machine
- ▶ Machine code:  $\lambda$ -expressions the  $\lambda_0$  language
- Instead of
  - bits
  - bit operations,

#### we have

- structured strings of symbols
- reduction textual substitution



### $\lambda_0$ features

- Instructions:
  - λ-expressions
  - top-level variable bindings: variable =<sub>def</sub> expression
     e.g., true =<sub>def</sub> λx.λy.x
- Values represented as functions
- Expressions brought to the closed form, prior to evaluation
- Normal-order evaluation
- Functional normal form (see Definition 6.2)
- No predefined types!



### **Shorthands**

$$\lambda x_1.\lambda x_2.\lambda...\lambda x_n.E \rightarrow \lambda x_1 x_2...x_n.E$$

$$ightharpoonup ((...((E A_1) A_2) ...) A_n) 
ightharpoonup (E A_1 A_2 ... A_n)$$



### Purpose of types

- Way of expressing the programmer's intent
- Documentation: which operators act onto which objects
- Particular representation for values of different types: 1, "Hello", #t, etc.
- Optimization of specific operations
- Error prevention
- Formal verification



### No types

#### How are objects represented?

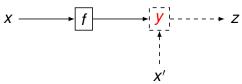
 A number, list or tree potentially designated by the same value e.g.,

number 
$$3 \rightarrow \lambda x.\lambda y.x \leftarrow \text{list}(()()())$$

Both values and operators represented by functions
 — context-dependent meaning

number 
$$3 \rightarrow \lambda x. \lambda y. x \leftarrow$$
 operator *car*

Value applicable onto another value, as an operator!





### No types

#### How is correctness affected?

- Inability of the λ machine to
  - interpret the meaning of expressions
  - ensure their correctness
- Every operator applicable onto every value
- Both aspects above delegated to the programmer
- Erroneus constructs accepted without warning, but computation ended with
  - values with no meaning or
  - expressions that are neither values, nor reducible e.g., (x x)



### No types

#### Consequences

- Enhanced representational flexibility
- Useful when the uniform representation of objects, as lists de symbols, is convenient
- Increased error-proneness
- Program instability
- Difficulty of verification and maintenance



#### So...

► How do we employ the  $\lambda_0$  language in everyday programming?

How do we represent usual values — numbers, booleans, lists, etc. — and their corresponding operators?



#### **Definition**

### **Definition 9.1 (Abstract data type, ADT).**

Mathematical model of a set of values and their corresponding operations.

### Example 9.2 (ADTs).

Natural, Bool, List, Set, Stack, Tree, ... λ-expression!

#### Components:

- base constructors: how are values built
- operators: what can be done with these values
- axioms: how



#### The Natural ADT

#### Base constructors and operators

- Base constructors:
  - zero : → Natural
  - succ : Natural → Natural

- Operators:
  - zero? : Natural → Bool
  - pred : Natural \ {zero} → Natural
  - add : Natural<sup>2</sup> → Natural



#### The Natural ADT

#### **Axioms**

- zero?
  - (zero? zero) = T
  - ► (zero? (succ n)) = F
- pred
  - ▶ (pred (succ n)) = n
- add
  - ▶ (add zero n) = n
  - (add (succ m) n) = (succ (add m n))



### Providing axioms

One axiom for each (operator, base constructor) pair

More — useless

 Less — insufficient for completely specifying the operators



### From ADTs to functional programming

#### Exemple

- Axiome:
  - ▶ add(zero, n) = n
  - ▶ add(succ(m), n) = succ(add(m, n))

#### Scheme:

```
(define add
(lambda (m n)
(if (zero? m) n
(+ 1 (add (- m 1) n)))))
```

#### Haskell:

```
1 add 0 n = n
2 add (m + 1) n = 1 + (add m n)
```



## From ADTs to functional programming

- Proving ADT correctness
  - structural induction
- Proving properties of λ-expressions, seen as values of an ADT with 3 base constructors!
- Functional programming
  - reflection of mathematical specifications
- Recursion
  - natural instrument, inherited from axioms
- Applying formal methods on the recursive code, taking advantage of the lack of side effects



#### Base contrsuctors and operators

- Base constructors:
  - **T**: → Bool
  - F : → Bool
- Operators:
  - ▶ not : Bool → Bool
  - and :  $Bool^2 \rightarrow Bool$
  - or :  $Bool^2 \rightarrow Bool$
  - *if* : *Bool*  $\times$  *T*  $\times$  *T*  $\rightarrow$  *T*



#### **Axioms**

- not
  - ► (not T) = F
  - ▶ (*not F*) = *T*
- and
  - ► (and T a) = a
  - ► (and F a) = F
- or
  - ► (or T a) = T
  - $\rightarrow$  (or F a) = a
- if
- (if T a b) = a
- ▶ (*if* F a b) = b



#### Base constructor implementation

Intuition: selecting one of the two values, true or false

- ►  $T \equiv_{\mathsf{def}} \lambda xy.x$
- $ightharpoonup F \equiv_{\mathsf{def}} \lambda xy.y$
- Selector-like behavior:
  - ▶  $(T \ a \ b) \rightarrow (\lambda xy.x \ a \ b) \rightarrow a$
  - ▶  $(F \ a \ b) \rightarrow (\lambda xy.y \ a \ b) \rightarrow b$



#### Operator implementation

- ▶  $not \equiv_{def} \lambda x.(x \ F \ T)$ 
  - $\bullet (not T) \rightarrow (\lambda x.(x F T) T) \rightarrow (T F T) \rightarrow F$
  - $(not \ F) \rightarrow (\lambda x.(x \ F \ T) \ F) \rightarrow (F \ F \ T) \rightarrow T$
- ▶ and  $\equiv_{\mathsf{def}} \lambda xy.(x \ y \ F)$ 
  - (and T a)  $\rightarrow$  ( $\lambda xy.(x \ y \ F) \ T$  a)  $\rightarrow$  (T a F)  $\rightarrow$  a
  - (and F a)  $\rightarrow$  ( $\lambda xy.(x \ y \ F) \ F$  a)  $\rightarrow$  (F a F)  $\rightarrow$  F
- - (or T a)  $\rightarrow$  ( $\lambda xy.(x T y) T a$ )  $\rightarrow$  (T T a)  $\rightarrow$  T
  - (or F a)  $\rightarrow$  ( $\lambda xy.(x T y) F$  a)  $\rightarrow$  (F T a)  $\rightarrow$  a
- if  $\equiv_{def} \lambda cte.(c\ t\ e)$  non-strict!
  - (if  $T \ a \ b$ )  $\rightarrow$  ( $\lambda$  cte.( $c \ t \ e$ )  $T \ a \ b$ )  $\rightarrow$  ( $T \ a \ b$ )  $\rightarrow$  a
  - (if  $F \ a \ b$ )  $\rightarrow$  ( $\lambda cte.(c \ t \ e) \ F \ a \ b$ )  $\rightarrow$  ( $F \ a \ b$ )  $\rightarrow$  b



#### The Pair ADT

#### Specification

- Base constructors:
  - pair : A × B → Pair
- Operators:
  - fst : Pair → A
  - snd : Pair → B
- Axioms:
  - ► (fst (pair a b)) = a
  - ▶ (snd (pair a b)) = b



#### The Pair ADT

#### Implementation

- Intuition: a pair = a function that expects a selector, in order to apply it onto its components
- ▶  $pair \equiv_{def} \lambda xys.(s \ x \ y)$ 
  - ▶ (pair a b)  $\rightarrow$  ( $\lambda xys.(s x y) a b$ )  $\rightarrow \lambda s.(s a b)$
- $fst \equiv_{def} \lambda p.(p T)$ 
  - (fst (pair a b))  $\rightarrow$  ( $\lambda p.(p T) \lambda s.(s a b)$ )  $\rightarrow$  ( $\lambda s.(s a b) T$ )  $\rightarrow$  (T a b)  $\rightarrow$  a
- ▶  $snd \equiv_{def} \lambda p.(p F)$ 
  - (snd (pair a b))  $\rightarrow$  ( $\lambda p.(p F) \lambda s.(s <math>a$  b))  $\rightarrow$  ( $\lambda s.(s a b) F$ )  $\rightarrow$  (F a b)  $\rightarrow$  b



#### The List ADT

#### Base constructors and operators

- Base constructors:
  - null : → List
  - cons : A × List → List

- Operators:
  - car : List \ {null} → A
  - $\qquad \qquad \textbf{cdr}: \textbf{List} \setminus \{\textbf{null}\} \rightarrow \textbf{List}$
  - null?: List → Bool
  - append : List<sup>2</sup> → List



### The List ADT

#### **Axioms**

- car
  - ► (car (cons e L)) = e
- ► cdr
  - ► (cdr (cons e L)) = L
- ▶ null?
  - ► (null? null) = T
  - ► (null? (cons e L)) = F
- append
  - ► (append null B) = B
  - (append (cons e A) B) = (cons e (append A B))



#### The List ADT

#### Implementation

- Intuition: a list = a (head, tail) pair
- ▶  $null \equiv_{def} \lambda x.T$
- cons ≡<sub>def</sub> pair
- car ≡<sub>def</sub> tst
- cdr ≡<sub>def</sub> snd
- ▶ null?  $\equiv_{def} \lambda L.(L \lambda xy.F)$ 
  - ▶ (null? null)  $\rightarrow$  ( $\lambda L.(L \lambda xy.F) \lambda x.T$ )  $\rightarrow$  ( $\lambda x.T ...$ )  $\rightarrow$  T
  - (null? (cons e L))  $\rightarrow$  ( $\lambda L.(L \lambda xy.F) \lambda s.(s e L)) <math>\rightarrow$  $(\lambda s.(s e L) \lambda xy.F) \rightarrow (\lambda xy.F e L) \rightarrow F$
- append = def ... no closed form  $\lambda AB.(if (null? A) B (cons (car A) (append (cdr A) B)))$

#### The Natural ADT

#### **Axioms**

- zero?
  - (zero? zero) = T
  - (zero? (succ n)) = F
- pred
  - ▶ (pred (succ n)) = n
- add
  - ▶ (add zero n) = n
  - (add (succ m) n) = (succ (add m n))



#### The Natural ADT

#### Implementation

- Intuition: a number = a list having the number value as its length
- zero ≡<sub>def</sub> null
- $succ \equiv_{def} \lambda n.(cons \ null \ n)$
- zero? ≡<sub>def</sub> null?
- pred ≡<sub>def</sub> cdr
- add ≡<sub>def</sub> append



#### **Functions**

- Several possible definitions of the identity function:
  - id(n) = n
  - id(n) = n + 1 1
  - id(n) = n + 2 2
- Infinitely many textual representations for the same function
- Then... what is a function? A relation between inputs and outputs, independent of any textual representation e.g.,

$$id = \{(0,0), (1,1), (2,2), \ldots\}$$



### Perspectives on recursion

Textual: a function that refers itself, using its name

 Constructivist: recursive functions as values of an ADT, with specific ways of building them

Semantic: the mathematical object designated by a recursive function



### Implementing length

Problem

Length of a list:

```
length \equiv_{def} \lambda L.(if (null? L) zero (succ (\underline{length} (cdr L))))
```

- What do we replace the underlined area with, to avoid textual recursion?
- Rewrite the definition as a fixed-point equation

```
Length \equiv_{def} \lambda fL.(if (null? L) zero (succ (f (cdr L))))
(Length length) \rightarrow length
```

How do we compute the fixed point? (see code archive)



### Axiomatization benefits

Disambiguation

Proof of properties

Implementation skeleton



### **Syntax**

Variable:

Var :=any symbol distinct from  $\lambda$ , ., (, )

Expression:

$$Expr ::= Var$$
  
 $\mid \lambda Var.Expr$   
 $\mid (Expr Expr)$ 

Value:

$$Val := \lambda Var.Expr$$



### **Evaluation rules**

Rule name:

 $\frac{precondition_1, \dots, precondition_n}{conclusion}$ 



# Semantics for normal-order evaluation

Reduce:

Evaluation

$$(\lambda x.e\ e') \rightarrow e_{[e'/x]}$$

Eval:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textcolor{red}{\textbf{\textit{e}}} \ \textbf{\textit{e}}'') \rightarrow (\textcolor{red}{\textbf{\textit{e}}'} \ \textbf{\textit{e}}'')}$$



### Semantics for normal-order evaluation

#### Substitution

$$ightharpoonup X_{[e/X]} = e$$

$$V_{[e/x]} = y, \quad y \neq x$$

$$\langle \lambda x.e \rangle_{[e'/x]} = \lambda x.e$$

$$\langle \lambda y.e \rangle_{[e'/x]} = \lambda y.e_{[e'/x]}, \quad y \neq x \land y \notin FV(e')$$

$$\langle \lambda y.e \rangle_{[e'/x]} = \lambda z.e_{[z/y][e'/x]},$$

$$y \neq x \land y \in FV(e') \land z \notin FV(e) \cup FV(e')$$

• 
$$(e' e'')_{[e/x]} = (e'_{[e/x]} e''_{[e/x]})$$



# Semantics for normal-order evaluation Free variables

► 
$$FV(x) = \{x\}$$

▶ 
$$FV(\lambda x.e) = FV(e) \setminus \{x\}$$

▶ 
$$FV((e' e'')) = FV(e') \cup FV(e'')$$



# Semantics for normal-order evaluation Example

## **Example 12.1 (Evaluation rules).**

$$((\lambda x.\lambda y.y \ a) \ b)$$

$$\frac{(\lambda x.\lambda y.y \ a) \rightarrow \lambda y.y \ (Reduce)}{((\lambda x.\lambda y.y \ a) \ b) \rightarrow (\lambda y.y \ b)} \quad (\textit{Eval})$$

$$(\lambda y.y \ b) \rightarrow b \ (Reduce)$$



# Semantics for applicative-order evaluation

Evaluation

Reduce (*v* ∈ Val):

$$(\lambda x.e \ v) \rightarrow e_{[v/x]}$$

▶ Eval<sub>1</sub>:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textcolor{red}{\textbf{\textit{e}}} \ \textbf{\textit{e}}'') \rightarrow (\textcolor{red}{\textbf{\textit{e}}'} \ \textbf{\textit{e}}'')}$$

Eval<sub>2</sub> (e ∉ Val):

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\lambda \textbf{\textit{x}}.\textbf{\textit{e}}'' \hspace{0.1cm} \textbf{\textit{e}}) \rightarrow (\lambda \textbf{\textit{x}}.\textbf{\textit{e}}'' \hspace{0.1cm} \textbf{\textit{e}}')}$$



## Formal proof

## Proposition 12.2 (Free and bound variables).

$$\forall e \in Expr \bullet BV(e) \cap FV(e) = \emptyset$$

#### Proof.

Structural induction, according to the different forms of  $\lambda$ -expressions (see the lecture notes).



## Summary

 Practical usage of the untyped lambda calculus, as a programming language

 Formal specifications, for different evaluation semantics



## Part IV

# Typed Lambda Calculus



## Drawbacks of the absence of types

- Meaningless expressions e.g., (car 3)
- No canonical representation for the values of a given type e.g., both a tree and a set having the same representation
- Impossibility of translating certain expressions into certain typed languages e.g., (x x), Ω, Fix
- Potential irreducibility of expressions inconsistent representation of equivalent values

$$\lambda x.(Fix \ x) \rightarrow \lambda x.(x \ (Fix \ x)) \rightarrow \lambda x.(x \ (x \ (Fix \ x))) \rightarrow \dots$$



#### Solution

 Restricted ways of constructing expressions, depending on the types of their parts

Sacrificed expressivity in change for soundness



## Desired properties

### **Definition 13.1 (Progress).**

A well-typed expression is either a value or is subject to at least one reduction step.

### **Definition 13.2 (Preservation).**

The result obtained by reducing a well-typed expression is well-typed. Usually, the type is the same.

## **Definition 13.3 (Strong normalization).**

The evaluation of a well-typed expression terminates.



## Base and simple types

### Definition 14.1 (Base type).

An atomic type e.g., numbers, booleans etc.

## Definition 14.2 (Simple type).

A type built from existing types e.g.,  $\sigma \rightarrow \tau$ , where  $\sigma$  and  $\tau$  are types.

#### Notation:

- $e:\tau$ : "expression e has type  $\tau$ "
- ▶  $v \in \tau$ : "v is a value of type  $\tau$ "
- ho  $e \in \tau \Rightarrow e : \tau$
- ightharpoonup  $e: \tau \Rightarrow e \in \tau$



## Typed $\lambda$ -expressions

### **Definition 14.3** ( $\lambda_t$ -expression).

- ▶ Base value: a base value  $b \in \tau_b$  is a  $\lambda_t$ -expression.
- Typed variable: an (explicitly) typed variable x : τ is a λ<sub>t</sub>-expression.
- ▶ Function: if  $x : \sigma$  is a typed variable and  $e : \tau$  is a  $\lambda_t$ -expression, then  $\lambda x : \sigma.e : \sigma \to \tau$  is a  $\lambda_t$ -expression, which stands for . . . .
- ▶ Application: if  $f : \sigma \to \tau$  and  $a : \sigma$  are  $\lambda_t$ -expressions, then  $(f \ a) : \tau$  is a  $\lambda_t$ -expression, which stands for . . . .



# Relation to untyped lambda calculus

#### Similarities

- β-reduction
- α-conversion
- normal forms
- Church-Rosser theorem

#### **Differences**

- (x : τ x : τ) invalid
- some fixed-point combinators are invalid



# Syntax

#### **Expressions**

Variables:

Expressions:

Values:

$$Val ::= BaseVal$$
  
 $\lambda Var : Type.Expr$ 



## Syntax Types

Types:

Type 
$$::=$$
 BaseType  $|$   $(Type \rightarrow Type)$ 

- Typing contexts:
  - include variable-type associations i.e., typing hypotheses

```
TypingContext ::= 0

| TypingContext, Var : Type
```



# Semantics for normal-order evaluation

Reduce:

Evaluation

$$(\lambda X: au.e \ e') 
ightarrow e_{[e'/X]}$$

Eval:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textcolor{red}{\textbf{\textit{e}}} \ \textbf{\textit{e}}'') \rightarrow (\textcolor{red}{\textbf{\textit{e}}'} \ \textbf{\textit{e}}'')}$$

The type annotations are ignored, since typing precedes evaluation.



## **Semantics**

#### **Typing**

$$\frac{\textit{\textbf{v}} \in \textit{\textbf{\tau}}_{\textit{\textbf{b}}}}{\Gamma \; \vdash \; \textit{\textbf{v}} : \textit{\textbf{\tau}}_{\textit{\textbf{b}}}}$$

TVar:

$$\frac{X:\tau\in\Gamma}{\Gamma\vdash X:\tau}$$

► TAbs:

$$\frac{\Gamma, X : \tau \vdash e : \tau'}{\Gamma \vdash \lambda X : \tau.e : (\tau \to \tau')}$$

► TApp:

$$\frac{\Gamma \vdash \textit{e} : (\tau' \rightarrow \tau) \qquad \Gamma \vdash \textit{e}' : \tau'}{\Gamma \vdash (\textit{e} \textit{e}') : \tau}$$



## Typing example

## Example 14.4 (Typing).

$$\lambda X : \tau_1.\lambda Y : \tau_2.X : (\tau_1 \rightarrow (\tau_2 \rightarrow \tau_1))$$

Blackboard!



## Type systems

### Definition 14.5 (Type system).

The set of rules and mechanisms used in a programming language to organize, build and handle the types accepted in the language.

### Definition 14.6 (Soundness).

The type system of a language is *sound* if any well-typed expression in the language has the progress and preservation properties.

### **Proposition 14.7.**

STLC is sound and possesses the strong normalization property.



# Ways of extending STLC

1. Particular base types

2. n-ary type constructors,  $n \ge 1$ , which build simple types



#### Algebraic specification

- Base constructors i.e., canonical values:
  - $\tau * \tau' ::= (\tau, \tau')$
- Operators:
  - $fst: \tau * \tau' \rightarrow \tau$
  - snd :  $\tau * \tau' \rightarrow \tau'$
- Axioms (e: τ, e': τ'):
  - (fst (e, e')) → e
  - (snd (e, e')) → e'



**Syntax** 

```
Expr ::= ...
      (fst Expr)
      (snd Expr)
      | (Expr, Expr)
BaseVal ::= ...
        ProductVal
ProductVal ::= (Val, Val)
 Type ::= ...
      ∣ (Type∗ Type)
```



#### Evaluation

EvalFst:

$$(fst (e,e')) \rightarrow e$$

► EvalSnd:

$$(\textit{snd}\ (\textit{e},\textit{e}')) \rightarrow \textit{e}'$$

EvalFstApp:

$$\frac{\textbf{e} \rightarrow \textbf{e}'}{(\textit{fst e}) \rightarrow (\textit{fst e}')}$$

EvalSndApp:

$$\frac{\textbf{e} \rightarrow \textbf{e}'}{(\textbf{snd e}) \rightarrow (\textbf{snd e}')}$$



#### Typing

TProduct:

$$\frac{\Gamma \vdash \boldsymbol{e} : \boldsymbol{\tau} \qquad \Gamma \vdash \boldsymbol{e'} : \boldsymbol{\tau'}}{\Gamma \vdash (\boldsymbol{e}, \boldsymbol{e'}) : (\boldsymbol{\tau} * \boldsymbol{\tau'})}$$

► TFst:

$$\frac{\Gamma \vdash e : (\tau * \tau')}{\Gamma \vdash (\mathit{fst}\ e) : \tau}$$

► TSnd:

$$\frac{\Gamma \vdash e : (\tau * \tau')}{\Gamma \vdash (snd \ e) : \tau'}$$



Typing example

## Example 15.1 (Typing).

$$\Gamma \vdash \lambda X : ((\rho * \tau) \to \sigma).\lambda Y : \rho.\lambda Z : \tau.(X (y, Z))$$
$$: ((\rho * \tau) \to \sigma) \to \rho \to \tau \to \sigma$$

Blackboard!



#### Algebraic specification

- Base constructors i.e., canonical values:
  - ▶ Bool ::= True | False
- Operators:
  - not : Bool → Bool
  - and :  $Bool^2 \rightarrow Bool$
  - ▶ or :  $Bool^2 \rightarrow Bool$
  - *if* : *Bool*  $\times \tau \times \tau \rightarrow \tau$
- Axioms: see slide 81



# The Bool type Syntax

```
Expr ::= ...
    (if Expr Expr Expr)
   BaseVal ::= ...
          | BoolVal
  BoolVal ::= True | False
    BaseType ::= ...
             | Bool
```



#### Evaluation

EvalIfT:

(if True 
$$e e'$$
)  $\rightarrow e$ 

EvalIfF:

(if False 
$$e e'$$
)  $\rightarrow e'$ 

Evallf:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textit{if} \ \textbf{\textit{e}} \ \textbf{\textit{e}}_1 \ \textbf{\textit{e}}_2) \rightarrow (\textit{if} \ \textbf{\textit{e}}' \ \textbf{\textit{e}}_1 \ \textbf{\textit{e}}_2)}$$



#### Typing

► TTrue:

TFalse:

► *TIf*:

$$\frac{\Gamma \vdash e : Bool \qquad \Gamma \vdash e_1 : \tau \qquad \Gamma \vdash e_2 : \tau}{\Gamma \vdash (\textit{if} \ e \ e_1 \ e_2) : \tau}$$



#### Top-level variable bindings

▶  $not \equiv \lambda x : Bool.(if \ x \ False \ True)$ 

▶ and  $\equiv \lambda x$ : Bool. $\lambda y$ : Bool.(if x y False)

• or  $\equiv \lambda x$ : Bool. $\lambda y$ : Bool.(if x True y)



## The N type

#### Algebraic specification

- Base constructors i.e., canonical values:
  - $ightharpoonup \mathbb{N} ::= 0 \mid (succ \mathbb{N})$
- Operators:
  - $+: \mathbb{N}^2 \to \mathbb{N}$
  - ▶ zero? :  $\mathbb{N} \to Bool$
- ▶ Axioms  $(m, n \in \mathbb{N})$ :
  - (+ 0 n) = n
  - (+ (succ m) n) = (succ (+ m n))
  - ▶ (*zero*? 0) = *True*
  - ▶ (zero? (succ n)) = False



# The N type Operator semantics

► How to avoid defining evaluation and typing rules for each operator of N?

Introduce the primitive recursor for N, prec<sub>N</sub>, which allows for defining any primitive recursive function on natural numbers

Define the operators using the primitive recursor



# The N type Syntax

```
Expr ::= ...
      (succ Expr)
       (prec_{\mathbb{N}} \ Expr \ Expr \ Expr)
       BaseVal ::= ...
               ⊢ NVal
     NVal := 0
           (succ NVal)
       BaseType ::= ...
```



## The N type

#### Evaluation

EvalSucc:

$$\frac{\textbf{e} \rightarrow \textbf{e}'}{(\textbf{succ } \textbf{e}) \rightarrow (\textbf{succ } \textbf{e}')}$$

EvalPrec<sub>N0</sub>:

$$(\textit{prec}_{\mathbb{N}} \ \textit{e}_0 \ \textit{f} \ 0) \rightarrow \textit{e}_0$$

EvalPrec<sub>N1</sub> (n ∈ N):

$$(\textit{prec}_{\mathbb{N}} \ \textit{e}_0 \ \textit{f} \ (\textit{succ} \ \textit{n})) \rightarrow (\textit{f} \ \textit{n} \ (\textit{prec}_{\mathbb{N}} \ \textit{e}_0 \ \textit{f} \ \textit{n}))$$

► EvalPrec<sub>N2</sub>:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textit{prec}_{\mathbb{N}} \ \textbf{\textit{e}}_0 \ \textbf{\textit{f}} \ \textbf{\textit{e}}) \rightarrow (\textit{prec}_{\mathbb{N}} \ \textbf{\textit{e}}_0 \ \textbf{\textit{f}} \ \textbf{\textit{e}}')}$$



# The ℕ type Typing

► TZero:

$$\Gamma \vdash 0 : \mathbb{N}$$

► TSucc:

$$\frac{\Gamma \vdash e : \mathbb{N}}{\Gamma \vdash (succ \ e) : \mathbb{N}}$$

► TPrec<sub>N</sub>:

$$\frac{\Gamma \vdash e_0 : \tau \qquad \Gamma \vdash f : \mathbb{N} \to \tau \to \tau \qquad \Gamma \vdash e : \mathbb{N}}{\Gamma \vdash (\textit{prec}_{\mathbb{N}} \ e_0 \ f \ e) : \tau}$$



### The N type

#### Top-level variable bindings

▶  $zero? \equiv \lambda n : \mathbb{N}.(prec_{\mathbb{N}} \text{ True } \lambda x : \mathbb{N}.\lambda y : Bool.False n)$ 

 $ightharpoonup + \equiv \lambda m : \mathbb{N}.\lambda n : \mathbb{N}.(prec_{\mathbb{N}} \ n \ \lambda x : \mathbb{N}.\lambda y : \mathbb{N}.(succ \ y) \ m)$ 



## The (List $\tau$ ) type

#### Algebraic specification

- Base constructors i.e., canonical values:
  - (List  $\tau$ ) ::= [] $_{\tau}$  | (cons  $\tau$  (List  $\tau$ ))
- Operators:
  - head : (List τ) \ {[]} → τ
  - $tail: (List \ \tau) \setminus \{[]\} \rightarrow (List \ \tau)$
  - *length* : (*List*  $\tau$ )  $\rightarrow \mathbb{N}$
- ▶ Axioms ( $h \in \tau$ ,  $t \in (List \ \tau)$ ):
  - ► (head (cons h t)) = h
  - ▶ (tail (cons h t)) = t
  - ▶ (*length* []) = 0
  - ► (length (cons h t)) = (succ (length t))



# The (*List* $\tau$ ) type Syntax

```
Expr ::= ...
     (cons Expr Expr)
       (prec, Expr Expr Expr)
     BaseVal ::= ...
              ListVal
ListVal ::= []
       (cons Value ListVal)
     Type ::= ...
          (List Type)
```



## The (*List* $\tau$ ) type

#### Evaluation

EvalCons:

$$\frac{e \rightarrow e'}{(\textit{cons } e \ e'') \rightarrow (\textit{cons } e' \ e'')}$$

EvalPrec<sub>L0</sub>:

$$(prec_L e_0 f []) \rightarrow e_0$$

- ► EvalPrec<sub>L1</sub> ( $v \in Value$ ):  $(prec_L \ e_0 \ f \ (cons \ v \ e)) \rightarrow (f \ v \ e \ (prec_L \ e_0 \ f \ e))$
- EvalPrec<sub>L2</sub>:

$$\frac{\textbf{e} \rightarrow \textbf{e}'}{(\textbf{prec}_L \ \textbf{e}_0 \ \textbf{f} \ \textbf{e}) \rightarrow (\textbf{prec}_L \ \textbf{e}_0 \ \textbf{f} \ \textbf{e}')}$$



## The (List $\tau$ ) type Typing

TEmpty:

$$\Gamma \vdash []_{\tau} : (List \ \tau)$$

► TCons:

$$\frac{\Gamma \vdash e : \tau \qquad \Gamma \vdash e' : (\textit{List } \tau)}{\Gamma \vdash (\textit{cons } e \ e') : (\textit{List } \tau)}$$

► TPrec<sub>L</sub>:

$$\frac{\Gamma \vdash e_0 : \tau' \quad \Gamma \vdash f : \tau \to (\textit{List } \tau) \to \tau' \to \tau' \quad \Gamma \vdash e : (\textit{List } \tau)}{\Gamma \vdash (\textit{prec}_l \ e_0 \ f \ e) : \tau'}$$



## The (*List* $\tau$ ) type

Top-level variable bindings

▶ empty?  $\equiv \lambda I : (List \ \tau).(prec_L \ True \ f \ I),$  $f \equiv \lambda h : \tau.\lambda t : (List \ \tau).\lambda r : Bool.False$ 

▶ length  $\equiv \lambda I : (List \ \tau).(prec_L \ 0 \ f \ I),$  $f \equiv \lambda h : \tau.\lambda t : (List \ \tau).\lambda r : \mathbb{N}.(succ \ r)$ 



#### General recursion

- Primitive recursion
  - induces strong normalization
  - insufficient for capturing effectively computable functions

Introduce the operator fix i.e., a fixed-point combinator

 Gain computation power at the expense of strong normalization



## *fix*Evaluation

EvalFix:

$$(\textit{fix } \lambda \textit{x} : \tau.\textit{e}) \rightarrow \textit{e}_{[(\textit{fix } \lambda \textit{x} : \tau.\textit{e})/\textit{x}]} \qquad = (\textit{f } (\textit{fix } \textit{f}))$$

► EvalFix':

$$\frac{\textit{e} \rightarrow \textit{e}'}{(\textit{fix} \;\; \textit{e}) \rightarrow (\textit{fix} \;\; \textit{e}')}$$



#### Example 15.2 (The remainder function).

```
remainder = \lambda m : \mathbb{N}.\lambda n : \mathbb{N}.

((fix \lambda f : (\mathbb{N} \to \mathbb{N}).\lambda p : \mathbb{N}.

(if p < n then p else (f(p-n))) m)
```

The evaluation of (remainder 3 0) does not terminate.



## Monomorphism

- Within the types (τ \* τ') and (List τ), τ and τ' designate specific types e.g., Bool, N, (List N), etc.
- Dedicated operators for each simple type
- $fst_{\mathbb{N},Bool}$ ,  $fst_{Bool,\mathbb{N}}$ , . . .
- ► []<sub>N</sub>, []<sub>Bool</sub>, . . .
- empty?<sub>N</sub>, empty? $_{Bool}$ , . . .



#### Idea

Monomorphic identity function for type N:

$$id_{\mathbb{N}} \equiv \lambda x : \mathbb{N}.x : (\mathbb{N} \to \mathbb{N})$$

Polymorphic identity function — type variables:

$$id \equiv \lambda X \cdot \lambda x : X \cdot X \cdot \forall X \cdot (X \rightarrow X)$$

Type coercion prior to function application:

$$(id[\mathbb{N}] 5) \rightarrow (id_{\mathbb{N}} 5) \rightarrow 5$$



Program variables: stand for program values

Type variables: stand for types

$$TypeVar ::= ...$$



#### Expressions:

Values:

```
Value ::= BaseValue

| λ Var : Type.Expr

| λ TypeVar.Expr
```



Types:

```
Type ::= BaseType  | TypeVar   | (Type \rightarrow Type)   | \forall TypeVar.Type
```

Typing contexts:

```
TypingContext ::= 0
| TypingContext, Var : Type
| TypingContext, TypeVar
```



#### Evaluation

▶ Reduce<sub>1</sub>:

$$(\lambda \mathit{X}: \tau.\mathit{e}\ \mathit{e}') \rightarrow \mathit{e}_{[\mathit{e}'/\mathit{X}]}$$

► Reduce<sub>2</sub>:

$$\lambda X.e[ au] o e_{[ au/X]}$$

▶ Eval<sub>1</sub>:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textbf{\textit{e}} \ \textbf{\textit{e}}'') \rightarrow (\textbf{\textit{e}}' \ \textbf{\textit{e}}'')}$$

► Eval<sub>2</sub>:

$$rac{oldsymbol{e} o oldsymbol{e}'}{oldsymbol{e} [ au] o oldsymbol{e}'[ au]}$$



#### **Typing**

TBaseValue:

$$\frac{\textit{\textbf{V}} \in \textit{\textbf{\tau}}_{\textit{\textbf{b}}}}{\Gamma \; \vdash \; \textit{\textbf{V}} : \textit{\textbf{\tau}}_{\textit{\textbf{b}}}}$$

► TVar:

$$\frac{X:\tau\in\Gamma}{\Gamma\vdash X:\tau}$$

► TAbs<sub>1</sub>:

$$\frac{\Gamma, X : \tau \vdash \boldsymbol{e} : \tau'}{\Gamma \vdash \lambda X : \tau.\boldsymbol{e} : (\tau \rightarrow \tau')}$$

► TApp<sub>1</sub>:

$$\frac{\Gamma \vdash \textit{e} : (\tau' \rightarrow \tau) \qquad \Gamma \vdash \textit{e}' : \tau'}{\Gamma \vdash (\textit{e} \textit{e}') : \tau}$$



#### Typing

TAbs<sub>2</sub> — polymorphic expressions have universal types:

$$\frac{\Gamma, X \vdash e : \tau}{\Gamma \vdash \lambda X.e : \forall X.\tau}$$

► TApp<sub>2</sub>:

$$\frac{\Gamma \vdash e : \forall X.\tau}{\Gamma \vdash e[\tau'] : \tau_{[\tau'/X]}}$$



#### Substitution and free variables

- ► Expr<sub>[Expr/Var]</sub>
- Expr<sub>[Type/TypeVar]</sub>
- ► Type<sub>[Type/TypeVar]</sub>
- Free program variables
- Free type variables



## Typing example

#### Example 16.1 (Typing).

$$\Gamma \vdash \lambda f : \forall X.(X \to X).\lambda Y.\lambda x : Y.(f[Y] x)$$
$$: (\forall X.(X \to X) \to \forall Y.(Y \to Y))$$

Monomorphic function with polymorphic argument and result!

Blackboard!



### Examples of polymorphic expressions

#### Example 16.2 (Doubling a computation).

double 
$$\equiv \lambda X.\lambda f: (X \to X).\lambda x: X.(f (f x))$$
  
  $\vdots \forall X.((X \to X) \to (X \to X))$ 

#### Example 16.3 (Quadrupling a computation).

$$\begin{array}{ll} \textit{quadruple} & \equiv & \lambda X.(\textit{double}[X \rightarrow X] \; \textit{double}[X]) \\ & : & \forall X.((X \rightarrow X) \rightarrow (X \rightarrow X)) \end{array}$$



### Examples of polymorphic expressions

#### Example 16.4 (Reflexive computation).

reflexive 
$$\equiv \lambda f : \forall X.(X \rightarrow X).(f[\forall X.(X \rightarrow X)] f)$$
  
:  $(\forall X.(X \rightarrow X) \rightarrow \forall X.(X \rightarrow X))$ 

#### Example 16.5 (Fixed-point combinator).

$$Fix \equiv \lambda X.\lambda f: (X \to X).(f (Fix[X] f))$$
$$: \forall X.((X \to X) \to X)$$



#### **Problem**

Polymorphic identity function, on objects of a type built using 1-ary type constructors e.g., List:

$$f \equiv \lambda \, {\color{red}C}.\lambda \, {\color{black} X}.\lambda \, {\color{black} X} : ({\color{black} C} \, {\color{black} X}).x : \forall {\color{black} C}.\forall {\color{black} X}.(({\color{black} C} \, {\color{black} X}) \rightarrow ({\color{black} C} \, {\color{black} X}))$$

- C stands for a 1-ary type constructor, X stands for a type of program values i.e., a proper type
- ▶ Monomorphic identity function for type (*List*  $\mathbb{N}$ ):

$$f[List][\mathbb{N}] \to \lambda x : (List \mathbb{N}).x : ((List \mathbb{N}) \to (List \mathbb{N}))$$

► How do we prevent erroneous situations e.g., f[N][N], f[List][List]?



#### Solution

 Two categories of types: proper types, and type constructors i.e., λ TypeVar. Type

 Type not only program variables, but also type variables

The type of a type: kind



### Kinds Notation

- ► The kind of a proper type: \*
- The kind of a 1-ary type constructor: (\* ⇒ \*)
- ▶ The kind of an *n*-ary type constructor,  $n \ge 1$ :  $k_1 \Rightarrow k_2$
- ▶ The kind k of a type  $\tau$ :  $\tau$  :: k



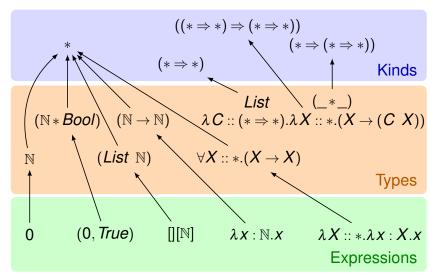
#### Kinds Examples

#### Example 18.1 (Kinds).

- ▶ N::\*
- **▶** *List* :: (\* ⇒ \*)
- $\uparrow \equiv \lambda C :: (* \Rightarrow *).\lambda X :: *.\lambda X : (C X).X$  $f : \forall C :: (* \Rightarrow *).\forall X :: *.((C X) \rightarrow (C X))$



## Levels of expressions





## Type equivalence

Two syntactically distinct types:

$$\begin{split} \tau_1 &\equiv ((\textit{List} \ \mathbb{N}) \to (\textit{List} \ \mathbb{N})) \\ \tau_2 &\equiv (\lambda \textit{X} :: *.((\textit{List} \ \textit{X}) \to (\textit{List} \ \textit{X})) \ \mathbb{N}) \end{split}$$

► Semantically, they denote the same type i.e., they are equivalent:  $\tau_1 \equiv \tau_2$ 



Types:

```
Type ::= BaseType

| TypeVar

| (Type \rightarrow Type)

| \forall TypeVar :: Kind.Type

| \lambda TypeVar :: Kind.Type

| (Type Type)
```

Typing contexts:

```
TypingContext ::= 0
| TypingContext, Var : Type
| TypingContext, TypeVar :: Kind
```



Kinds:



#### Evaluation

▶ Reduce<sub>1</sub>:

$$(\lambda X : \tau.e \ e') \rightarrow e_{[e'/X]}$$

▶ Reduce<sub>2</sub>:

$$\lambda X :: K.e[\tau] \rightarrow e_{[\tau/X]}$$

▶ Eval<sub>1</sub>:

$$\frac{\textbf{\textit{e}} \rightarrow \textbf{\textit{e}}'}{(\textbf{\textit{e}} \ \textbf{\textit{e}}'') \rightarrow (\textbf{\textit{e}}' \ \textbf{\textit{e}}'')}$$

▶ Eval<sub>2</sub>:

$$rac{oldsymbol{e} 
ightarrow oldsymbol{e}'}{oldsymbol{e}[ au] 
ightarrow oldsymbol{e}'[ au]}$$



#### Typing

TBaseValue:

$$\frac{\textit{\textit{V}} \in \textit{\textit{\tau}}_{\textit{\textit{b}}}}{\Gamma \; \vdash \; \textit{\textit{V}} : \textit{\textit{\tau}}_{\textit{\textit{b}}}}$$

► TVar:

$$\frac{X:\tau\in\Gamma}{\Gamma\vdash X:\tau}$$

► TAbs<sub>1</sub>:

$$\frac{\Gamma, X : \tau \vdash \mathbf{e} : \tau'}{\Gamma \vdash \lambda X.\mathbf{e} : (\tau \rightarrow \tau')}$$

► TApp<sub>1</sub>:

$$\frac{\Gamma \vdash \textit{e} : (\tau' \rightarrow \tau) \qquad \Gamma \vdash \textit{e}' : \tau'}{\Gamma \vdash (\textit{e} \textit{e}') : \tau}$$



#### Typing

► *TAbs*<sub>2</sub>:

$$\frac{\Gamma, X :: \mathbf{K} \vdash \mathbf{e} : \tau}{\Gamma \vdash \lambda X :: \mathbf{K}.\mathbf{e} : \forall X :: \mathbf{K}.\tau}$$

► TApp<sub>2</sub>:

$$\frac{\Gamma \vdash e : \forall X :: K.\tau \qquad \Gamma \vdash \tau' :: K}{\Gamma \vdash e[\tau'] : \tau_{[\tau'/X]}}$$



#### Kinding

KBaseType:

$$\Gamma \vdash \tau_b :: *$$

KTypeVar:

$$\frac{X :: K \in \Gamma}{\Gamma \vdash X :: K}$$

KTypeAbs:

$$\frac{\Gamma, X :: K \vdash \tau :: K'}{\Gamma \vdash \lambda X :: K.\tau :: (K \Rightarrow K')}$$

KTypeApp:

$$\frac{\Gamma \vdash \tau :: (K' \Rightarrow K) \qquad \Gamma \vdash \tau' :: K'}{\Gamma \vdash (\tau \ \tau') :: K}$$



Kinding

► *KAbs*<sub>1</sub>:

$$\frac{\Gamma \vdash \tau :: * \qquad \Gamma \vdash \tau' :: *}{\Gamma \vdash (\tau \to \tau') :: *}$$

► KAbs<sub>2</sub>:

$$\frac{\Gamma, X :: K \vdash \tau :: *}{\Gamma \vdash \forall X :: K.\tau :: *}$$



#### Type equivalence

EqReflexivity:

$$au \equiv au$$

► EqSymmetry:

$$rac{ au \equiv au'}{ au' \equiv au}$$

EqTransitivity:

$$\frac{\tau \equiv \tau' \qquad \tau' \equiv \tau''}{\tau \equiv \tau''}$$

EqTypeReduce:

$$(\lambda X :: K.\tau \ \tau') \equiv \tau_{[\tau'/X]}$$



#### **Semantics**

#### Type equivalence

EqTypeAbs:

$$\frac{\tau \equiv \tau'}{\lambda X :: K.\tau \equiv \lambda X :: K.\tau'}$$

EqTypeApp:

$$\frac{\tau \equiv \tau' \qquad \sigma \equiv \sigma'}{(\tau \ \sigma) \equiv (\tau' \ \sigma')}$$

► EqAbs<sub>1</sub>:

$$rac{ au \equiv au' \qquad \sigma \equiv \sigma'}{( au 
ightarrow \sigma) \equiv ( au' 
ightarrow \sigma')}$$

► EqAbs<sub>2</sub>:

$$\frac{\tau \equiv \tau'}{\forall X :: K.\tau \equiv \forall X :: K.\tau'}$$



#### **Semantics**

Type equivalence

TypeEquivalence:

$$\frac{\Gamma \vdash e : \tau \qquad \tau \equiv \tau'}{\Gamma \vdash e : \tau'}$$



#### Kinding example

#### Example 18.2 (Kinding).

$$\forall X :: *.(X \rightarrow ((List\ X) \rightarrow (Tree\ X))) :: *$$

Blackboard!



#### Part V

## Constructive Type Theory



### Classical logic

- ► Example: prove  $\exists x.P(x)$
- ▶ Perhaps, proof by contradiction: assume  $\neg \exists x.P(x)$  and reach a contradiction
- ► Assumption:  $\exists x.P(x) \lor \neg \exists x.P(x)$  (law of excluded middle)
- ▶ Problem: possibly no actual evidence regarding either sentence i.e., some a s.t. either P(a) or  $\neg P(a)$  is true



#### Constructive logic

- Prove ∃x.P(x) by computing an object a s.t. P(a) is true
- Not always possible
- ► However, not being able to compute a does not mean that  $\exists x.P(x)$  is false
- Law of excluded middle not an axiom in constructive logic



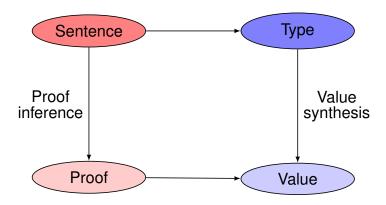
#### Constructive type theory

 Bridge between constructive logic and typed lambda calculus

- Correspondences:
  - ▶ sentence ↔ type
  - ▶ logical connective ↔ type constructor
  - ▶ proof ↔ function with that type
- Application: synthesize a program by proving the sentence that corresponds to its specification



#### The Curry-Howard isomorphism





#### Two views

a : A

- Type-theoretic: "a is a value of type A"
- ▶ Logical: "a is a proof of sentence A"



#### **Definitional rules**

Rule	Logical view	Type-theoretic view
Formation	How a connective re-	How a type construc-
	lates two sentences	tor is used
Introduction/	How a proof is derived	How a value is con-
elimination		structed
Computation	How a proof is simpli-	How an expression is
	fied	evaluated



## Other logic-type correspondences

Logical view	Type-theoretic view	
Truth (⊤)	One-element type, containing the trivial proof	
Falsity (⊥)	No-element type, containing no proof	
Proof by induction	Definition by recursion	



#### Logical conjunction / product type constructor I

► Formation rule (∧*F*):

$$\frac{A \text{ is a sentence/ type}}{A \land B \text{ is a sentence/ type}}$$

Introduction rule (∧I):

$$\frac{a:A \qquad b:B}{(a,b):A \wedge B}$$



#### Logical conjunction / product type constructor II

▶ Elimination rules ( $\land E_{1,2}$ ):

$$\begin{array}{ccc} p: A \wedge B & & p: A \wedge B \\ \hline fst & p: A & & snd & p: B \end{array}$$

Computation rules:



#### Logical implication / function type constructor I

▶ Formation rule ( $\Rightarrow$  *F*):

A is a sentence/ type B is a sentence/ type 
$$A \Rightarrow B$$
 is a sentence/ type

Introduction rule (⇒ I) (square brackets = discharged assumption):

$$[x : A]$$

$$\vdots$$

$$b : B$$

$$\overline{\lambda x : A.b : A \Rightarrow B}$$



### Logical implication / function type constructor II

▶ Elimination rule ( $\Rightarrow E$ ):

$$\frac{a:A \qquad f:A\Rightarrow B}{(f\ a):B}$$

Computation rule:

$$(\lambda x : A.b \ a) \rightarrow b_{[a/x]}$$



#### Logical disjunction / sum type constructor I

Formation rule (∨F):

$$\frac{A \text{ is a sentence/ type}}{A \lor B \text{ is a sentence/ type}}$$

▶ Introduction rules ( $\lor I_{1,2}$ ):

$$\frac{a:A}{inl \ a:A\vee B} \qquad \frac{b:B}{inr \ b:A\vee B}$$



#### Logical disjunction / sum type constructor II

► Elimination rule (∨E):

$$\frac{p:A\vee B \qquad f:A\Rightarrow C \qquad g:B\Rightarrow C}{cases\ p\ f\ g:C}$$

Computation rules:

cases (inl a) 
$$f g \rightarrow f a$$
 cases (inr b)  $f g \rightarrow g b$ 



#### Absurd sentence / empty type I

► Formation rule (⊥*F*):

 $\perp$  is a sentence/ type

► Introduction rule: none — there is no proof of the absurd sentence



### Absurd sentence / empty type II

► Elimination rule (⊥E) (a proof of the absurd sentence can prove anything):

$$\frac{p:\bot}{abort_A\ p:A}$$

Computation rule: none

#### Logical negation and equivalence

Logical negation:

$$\neg A \equiv A \Rightarrow \bot$$

Logical equivalence:

$$A \Leftrightarrow B \equiv (A \Rightarrow B) \land (B \Rightarrow A)$$



## Example proofs

- $A \Rightarrow A$
- ►  $A \Rightarrow \neg \neg A$  (converse?)
- $((A \land B) \Rightarrow C) \Rightarrow A \Rightarrow B \Rightarrow C$
- $(A \Rightarrow B) \Rightarrow (B \Rightarrow C) \Rightarrow (A \Rightarrow C)$
- $(A \Rightarrow B) \Rightarrow (\neg B \Rightarrow \neg A)$
- $(A \lor B) \Rightarrow \neg (\neg A \land \neg B)$



## Universal quantification / generalized function type constructor I

Formation rule (∀F) (square brackets = discharged assumption):

Introduction rule (∀I):

```
[x : A]
\vdots
b : B
(\lambda x : A).b : (\forall x : A).B
```



## Universal quantification / generalized function type constructor II

► Elimination rule (∀E):

$$\frac{a:A \qquad f:(\forall x:A).B}{(f\ a):B_{[a/x]}}$$

Computation rule:

$$((\lambda x : A).b \ a) \rightarrow b_{[a/x]}$$



## Existential quantification / generalized product type constructor I

Formation rule (∃F) (square brackets = discharged assumption):

Introduction rule (∃I):

$$\frac{a:A \qquad b:B_{[a/x]}}{(a,b):(\exists x:A).B}$$



# Existential quantification / generalized product type constructor II

▶ Elimination rules ( $\exists E_{1,2}$ ):

$$\frac{p: (\exists x: A).B}{Fst \ p: A} \qquad \frac{p: (\exists x: A).B}{Snd \ p: B_{[Fst \ p/x]}}$$

Computation rules:

Fst 
$$(a,b) \rightarrow a$$
  
Snd  $(a,b) \rightarrow b$ 



### Example proofs

$$(\forall x : A).(B \Rightarrow C) \Rightarrow (\forall x : A).B \Rightarrow (\forall x : A).C$$

► 
$$(\exists x : X). \neg P \Rightarrow \neg(\forall x : X). P$$
 (converse?)

► 
$$(\exists y : Y).(\forall x : X).P \Rightarrow (\forall x : X).(\exists y : Y).P$$
 (converse?)

