#### Lecture 2

### Lambda calculus

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### Literature

Henk Barendregt, Erik Barendsen, Introduction to Lambda Calculus, March 2000.

### Lambda calculus

- Leibniz had as ideal the following
  - 1) Create a 'universal language' in which all possible problems can be stated.
  - 2) Find a decision method to solve all the problems stated in the universal language.
- (1) was fulfilled by
  - Set theory + predicate calculus (Frege, Russel, Zermelo)
- (2) has become important philosophical problem:
  - Can one solve all problems formulated in the universal language?
  - Entscheidungsproblem

### Entscheidungsproblem

- Negative outcome
- Alonzo Church, 1936
  - Proposes LC as extension of logic
  - Shows the existance of undecidable problem
  - Functional programming languages
- Alan Turing, 1936
  - Proposes TM
  - Turing proved that both models define the same class of computable functions
  - Corresponds to Von Neumann computers
  - Imperative programming languages

### **Functions**

- Function is basic concept of classical and modern mathematics
- Let A and B be sets and let f be relation.
  - -dom(f) = X
  - $\forall x \in A$ :  $\exists$  unique  $y \in B$  such that  $(x,y) \in f$
  - Uniquness:  $(x,y) \in f \land (x,z) \in f \Rightarrow y=z$
  - f maps or transforms x to y
- f:A → B
  - f is function from A to B

### Lambda notation

- Lambda expression
  - Pure lambda calculus expression includes
    - variables: *x*, *y*, *z*, ...
    - lambda abstraction: λx.M
    - application: M N
- Lambda abstraction  $\lambda x.M$  represents function
  - -x is function argument
  - M is function expression
    - Receipt that specifies how function is »computed«
- Application M N
  - If  $M = \lambda x.M'$  then all occurences of x in M' are replaced with N
  - Mechanical definition of parameter passing

### On notations

- Let x + 1 be expression with variable x
  - Mathematical notation: f(x) = x + 1
  - Lambda notation:  $\lambda x.(x + 1)$
- Let x + y be expression where x and y are variables
  - Mathematical notation: f(x,y) = x + y
  - Lambda notation:  $\lambda x.\lambda y.(x + y)$
- Obvious difference:
  - $-\lambda$ -notation does not name function

# Definition of LC syntax

**Definition**: The set of  $\lambda$ -expressions  $\Lambda$  is constructed from infinite set of variables  $\{v,v',v'',v''',\dots\}$  by using application and  $\lambda$ -abstraction:

$$x \in V \Rightarrow x \in \Lambda$$
 $M, N \in \Lambda \Rightarrow (M \ N) \in \Lambda$ 
 $X \in V, M \in \Lambda \Rightarrow \lambda x. M \in \Lambda$ 

Backus-Naur form of  $\lambda$ -calculus syntax:

$$M ::= V | (\lambda v.M) | (M N)$$
  
 $V ::= v, v', v'' ...$ 

# Syntax rules

Application is left-associative

$$M N L \equiv (M N) L$$

\( \Lambda\)-abstraction is right-associative

$$\lambda x.\lambda y.\lambda z.M \ N \ L \equiv \lambda x.(\lambda y.(\lambda z.((M \ N) \ L)))$$

We often use the following abbreviation

$$\lambda x y z . M \equiv \lambda x . \lambda y . \lambda z . M$$

## Examples

- Let's see some examples of  $\lambda$ -expression
  - Notice spaces!

```
y
y \times x
(\lambda x.y \times) z
(\lambda x.\lambda y.x) z
(\lambda x.\lambda y.x) z w
(\lambda f.\lambda x.f (f x)) (\lambda v.\lambda y.v y)
```

### Examples: λ and ocaml

Some  $\lambda$ -expressions (notice spaces!):

```
3

\lambda x.x

(\lambda x.x) (\lambda y.y * y)

(\lambda z.z + 1) 3
```

#### In OCaml:

```
# 3;;
- : int = 3
# function x -> x;;
- : 'a -> 'a = <fun>
# (function x -> x) (function y->y*y);;
- : int -> int = <fun>
# (function z -> z + 1) 3;;
- : int = 4
```

#### Free and bound variables

- Abstraction  $\lambda x.M$  binds variable x in expression M
  - In simmilar manner the function argumens are bound to the function body
- M is scope of variable x in experssion  $\lambda x.M$
- *Variable x is free* in some expression M if there exist no  $\lambda$ -abstraction that binds it
- Name of free variable is important while the name of bound variable is not
- Example:

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

# Computing free variables

**Definition**: The set of free variables of  $\lambda$ -expression M, denoted FV(M), is defined with the following rules:

$$FV(x) = \{x\}$$

$$FV(M \ N \ ) = FV(M) \cup FV(N)$$

$$FV(\lambda x.M) = FV(M) - \{x\}$$

Example:

$$FV(\lambda x.x (\lambda y.x y z)) = \{z\}$$

**Definition:**  $\lambda$ -expression M is closed if  $FV(M)=\{\}$ .

#### Substitution

- Substitution is the basis of LC evaluation
  - Computing is string rewriting ?
- Substitute all instances of a variable x in  $\lambda$ -expression M with N:

[N/x]M

**Definition**: Let M,N $\in$ A and x,z $\in$ V. Substitution rules:

```
[N/x]x = N
[N/x]z = z, \text{ if } z \neq x
[N/x](L M) = ([N/x]L)([N/x]M)
[N/x](\lambda z.M) = \lambda z.([N/x]M), \text{ if } z \neq x \land z \notin FV(N)
```

## Example

- $[y(\lambda v.v)/x]\lambda z.(\lambda u.u) z x \equiv \lambda z.(\lambda u.u) z (y (\lambda v.v))$ 
  - Check evaluation of substitution rules!

## Alpha conversion

- Renaming bound variables in  $\lambda$ -expression yields equivalent  $\lambda$ -expression
- Example:

$$\lambda x.x \equiv \lambda y.y$$

Alpha conversion rule:

$$\lambda x.M \equiv \lambda y.([y/x]M)$$
, if  $y \notin FV(M)$ .

## Example: Alpha conversion

Λ-expression:

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

Blind substitution gives:

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

Correct substitution:

$$\lambda z.((\lambda y.y + x) ((\lambda y.y + x) z)) = \lambda z.z + x + x$$

### **Evaluation**

- Λ-calculus is very expressive language equivalent to Turing machine
- Evaluation of  $\lambda$ -expressions is based on:
  - 1)  $\alpha$ -coversion and
  - 2) substitution
- Evaluation is often called reduction
- \( \Lambda\)-expressions are reduced to value
  - Values are normal forms of  $\lambda$ -expressions i.e.  $\lambda$ -expressions that can not be further reduced

# **β-reduction**

- $\beta$ -reduction is the only rule used for evaluation of pure  $\lambda$ -calculus (aside from renaming)
- Expression  $(\lambda x.M)$  N stands for operator  $(\lambda x.M)$  applied to parameter N
- Intuitive interpretation of  $(\lambda x.M)$  N is substitution of x in M for N

# **β-reduction**

**Definition**: Let  $\lambda x.M$  be  $\lambda$ -expression. Application of  $(\lambda x.M)$  on parameter N is implemented with  $\beta$ -reduction:

$$(\lambda x.M) N \rightarrow [N/x]M$$

- Expression (λx.M) N is called redex (reducable expression)
- Expression [N/x]M is called contractum

# **β-reduction**

- P includes redex  $(\lambda x.M)$  N that is substituted with [N/x]M and we obtain P'
- We say that  $P \beta$ -reduces to P':

$$P \rightarrow_{\beta} P'$$

**Definition**:  $\beta$ -derivation is composed of one or more  $\beta$ -reductions.  $\beta$ -derivation from M to N:

$$M \twoheadrightarrow_{\beta} N$$

### Examples of the evaluation

- $(\lambda x.x y)(u v) \rightarrow_{\beta} u v y$
- $(\lambda x.\lambda y.x) z w \rightarrow_{\beta} (\lambda y.z)w \rightarrow_{\beta} z$  $(\lambda x.\lambda y.x) z w \rightarrow_{\beta} z$
- $(\lambda x.(\lambda y.yx)z)v \rightarrow [v/x](\lambda y.yx)z = (\lambda y.yv)z$  $\rightarrow [z/y]yv = zv$

# Examples of the evaluation

Example with identity function
 (λx.x)E → [E/x]x = E

• Another example with identity function  $(\lambda f.f(\lambda x.x))(\lambda x.x) \rightarrow [(\lambda x.x)/f]f(\lambda x.x) = [(\lambda x.x)/f]f(\lambda y.y) \rightarrow (\lambda x.x)(\lambda y.y) \rightarrow [(\lambda y.y)/x]x = \lambda y.y$ 

## Examples of the evaluation

Repeating β-derivation
 (λx.xx)(λy.yy)
 → [(λy.yy)/x]xx = (λx.xx)(λy.yy)
 → [(λy.yy)/x]xx = (λx.xx)(λy.yy)
 → ...

• Counting  $\beta$ -derivation:

```
(\lambda x.xxy)(\lambda x.xxy)
```

- $\rightarrow$  [( $\lambda x.xxy$ )/x]xxy = ( $\lambda x.xxy$ )( $\lambda x.xxy$ )y
- $\rightarrow$  ([( $\lambda x.xxy$ )/x]xxy)y = ( $\lambda x.xxy$ )( $\lambda x.xxy$ )yy  $\rightarrow$  ...

## Higher-order functions

- Higher-order function is a function that can either:
  - take another function as an argument, or,
  - return function as the result of function application.
- Example:
  - Construct compositum:  $(f \circ f)(x) = f(f(x))$
  - Lambda expression:  $\lambda f.\lambda x.f$  (f x)

```
(\lambda f.\lambda x.f (f x))(\lambda y.y + 1)
= \lambda x.(\lambda y.y + 1)((\lambda y.y + 1) x)
= \lambda x.(\lambda y.y + 1)(x + 1)
= \lambda x.(x + 1) + 1
```

# Higher-order functions

• The same function  $(f \circ f)(x)$  in Lisp

```
(lambda(f)(lambda(x)(f (f x))))

((lambda(f)(lambda(x)(f (f x))))(lambda(y)(+ y 1))

= (lambda(x)((lambda(y)(+ y 1))((lambda(y)(+ y 1)) x))))

= (lambda(x)((lambda(y)(+ y 1))(+ x 1))))

= (lambda(x)(+ (+ x 1) 1))
```

# **Examples in Ocaml**

```
# let c = 4;;
valc:int=4
# let sq = function x -> x*x;; (* \lambda x.x*x*)
val sq : int -> int = <fun>
# let nx = function x -> x + 1;; (* \lambda x.x+1 *)
val nx : int -> int = <fun>
#
# let compose = function f -> function g -> function x -> f(g(x)); (* \lambda f.\lambda g.\lambda x.f(g(x))
val compose : ('a -> 'b) -> ('c -> 'a) -> 'c -> 'b = <fun>
# let rcompose = function f -> function g -> function x -> g(f(x));; (* \lambda f.\lambda g.\lambda x.g(f(x))
val rcompose : ('a -> 'b) -> ('b -> 'c) -> 'a -> 'c = < fun>
                                                     (* c1 = (\lambda f.\lambda g.\lambda x.f(g(x))) (\lambda x.x*x) (\lambda x.x+1)
# let c1 = compose sq nx;;
val c1 : int -> int = <fun>
                                                     (* c2 = (\lambda f.\lambda g.\lambda x.g(f(x))) (\lambda x.x*x) (\lambda x.x+1)
# let c2 = rcompose sq nx;;
val c2 : int -> int = < fun>
#
# c1 3;;
-: int = 16
# c2 3;;
-: int = 10
```

# Programming in LC

- Function in Curry form
- Combinators
  - Primitives of programming languages
- Logical values
  - If statement
- Integer numbers
  - Arithmetics
- Recursion

# **Curry functions**

- Functions can have single parameter in  $\lambda$ -calculus
- Multiple parameters can be implemented by using higher-order functions
- F is function with parameters (N, L) and body M
  - M be expression with free variables x and y
  - We wish to replace x with N and y with L
- Curry notation:  $F = \lambda x.\lambda y.M$ 
  - − F N L →  $(\lambda y.[N/x]M)L \rightarrow [L/y][N/x]M$
  - $\Lambda$ -calculus with pairs:  $F \equiv \lambda(x,y).M$
- Transformation from λ(x,y).M to λx.λy.M is called Currying

## Example: Curry functions

- Math notation: sum  $\equiv \lambda(x,y).x + y$ 
  - sum :  $\mathbb{Z} \rightarrow \mathbb{Z} \rightarrow \mathbb{Z}$  (type of sum)
- Curry notation: sum =  $\lambda x.\lambda y.x + y$ 
  - Application to the first argument returns a function.
     funkcijo.
  - suma ≡ (λx.λy.x + y) a -> λy.a + y
  - suma : ℤ→ℤ
- Ocaml libraries are written in Curry notation
  - New functions can be defined from existing functions.
  - Examples will be presented on the lecture on Functional languages

#### Combinators

- Combinators are primitive functions
  - Expressing basic operations of computation
  - Functions: identity, composition, choice, etc.
- Combinatory logic CL
  - Curry, Feys, 1958
  - Combinators are building blocks of CL
  - CL uses combinators I, K and S
- Combinators are often used in programming languages
  - Functions that construct new functions (genericity?)
    - Examples will be given when we present fun. languages
  - Higher-order functions: apply, map, fold, filter, etc.

### Combinators

Identity function:

$$I = \lambda x.x$$

Choosing one argument of two (if):

$$\mathbf{K} = \lambda \mathbf{x}.(\lambda \mathbf{y}.\mathbf{x})$$

Passing argument to two functions:

$$S = \lambda x.\lambda y.\lambda z.(x z)(y z)$$

Function that repeats itself (loop):

$$\mathbf{\Omega} = (\lambda \mathbf{x}.\mathbf{x} \ \mathbf{x})(\lambda \mathbf{x}.\mathbf{x} \ \mathbf{x})$$

Function composition:

$$\mathbf{B} = \lambda f. \lambda g. \lambda x. f(g x)$$

### Combinators

• Inverse function composition:

$$\mathbf{B'} = \lambda f. \lambda g. \lambda x. g(f x)$$

Duplication of function argument:

$$W = \lambda f. \lambda x. f \times x$$

Recursive function:

$$\mathbf{Y} = \lambda f.(\lambda x.f(x x))(\lambda x.f(x x))$$

## Logical values

- How to represent truth (logical) values?
  - true  $\equiv \lambda t.\lambda f.t$  | function returning first argument of two
  - false  $\equiv \lambda t.\lambda f.f$  | function returning second argument of two
- IF statement is simple application of truth value
  - $-\lambda I.\lambda m.\lambda n. I m n$
  - Truth value determines first or second choice
- Evaluation of IF statement

```
IF true M N \equiv (\lambda I.\lambda m.\lambda n. I m n) true M N \rightarrow (\lambda m.\lambda n. true m n) M N \rightarrow true M N = (\lambda t.\lambda f.t) M N \rightarrow (\lambda f.M) N \rightarrow M
```

#### Church numbers

Number n is represented with C<sub>n</sub>

- $C_0 = \lambda z.\lambda s.z$   $C_1 = \lambda z.\lambda s.s z$   $C_2 = \lambda z.\lambda s.s(s z)$ ...  $C_n = \lambda z.\lambda s.s(s(...(s z)...)$
- n = 0+1+...+1 | n times successor of 0
- z stands for zero and s represents successor function
- Arithmetic operations
  - Plus =  $\lambda m. \lambda n. \lambda z. \lambda s. m$  (n z s) s
  - Times =  $\lambda m.\lambda n.m$  C<sub>0</sub> (Plus n)

#### Church numbers

(Plus 1 2)  $\to$ \* 3

```
Plus (\lambda z.\lambda s.s.z) (\lambda z.\lambda s.s(s.z)) \rightarrow
(\lambda m.\lambda n.\lambda z.\lambda s.m(n z s)s) (\lambda z.\lambda s.s z) (\lambda z.\lambda s.s(s z)) \rightarrow
(\lambda n.\lambda z.\lambda s.(\lambda z.\lambda s.s z)(n z s)s)(\lambda z.\lambda s.s(s z)) \rightarrow
\lambda z.\lambda s.(\lambda z.\lambda s.s z)((\lambda z.\lambda s.s(s z)) z s)s \rightarrow
\lambda z.\lambda s.(\lambda z.\lambda s.s.z)((\lambda s.s(s.z))s)s \rightarrow
\lambda z.\lambda s.(\lambda z.\lambda s.s.z)(s(s.z))s =
\lambda z.\lambda s.(((\lambda z.\lambda s.s.z)(s(s.z)))s) \rightarrow
\lambda z.\lambda s.((\lambda s.s(s(sz)))s) \rightarrow
\lambda z.\lambda s.s(s(sz))
```

#### Recursion

Recursion can be expressed using combinator Y

```
- Y = \lambda f.(\lambda x.f(x x))(\lambda x.f(x x))
```

Important property of Y

```
-YF =_{\beta} F(YF)
```

– Proof:

```
Y F = \lambda f.(\lambda x.f(x x))(\lambda x.f(x x)) F \rightarrow

(\lambda x.F(x x))(\lambda x.F(x x)) \rightarrow

F ((\lambda x.F(x x))(\lambda x.F(x x))) \leftarrow

F ((\lambda f.(\lambda x.f(x x))(\lambda x.f(x x))) F ) =

F (Y F)
```

#### Recursion

- Operation factorial: n!
  - Intuitive definition
- Definition of recursive function F

```
-G = \lambda f.M | M is body of f
```

-F=YG

Derivation of F

```
if n = 0 then 1
else n * (if n - 1 = 0 then 1)
else (n - 1) * (if n - 2 = 0 then 1)
else (n - 2) * ...
```

```
F = YG
=_{\beta} G (Y G)
=_{\beta} G (Y G)
=_{\beta} G (G (Y G))
...
```

### **Factorial**

```
Fact = \lambdafact.\lambdan.if (IsZero n) C1 (Times n (fact (Pred n)))
Factorial = Y Fact
Factorial C2 = Y Fact C2
=_{\beta} Fact (Y Fact) C2
=_{\beta} (\lambda fact.\lambda n.if (IsZero n) C1 (Times n (fact (Pred n)))) (Y Fact) C2
=_{\beta} (\lambdan.if (IsZero n) C1 (Times n (Y Fact (Pred n)))) C2
=_{\beta} if (IsZero C2 ) C1 (Times C2 (Y Fact (Pred C2)))
=_{\beta} if False C1 (Times C2 (Y Fact C1 )))
=_{\beta} Times C2 (Y Fact C1)
= Times C2 (Factorial C1)
```

### β-normal form

**Definition**: 1)  $\lambda$ -expression Q that does not include  $\beta$ -redexes is in  $\beta$ -normal form.

- 2) The class of all  $\beta$ -normal forms is called  $\beta$ -nf.
- 3) If  $P \beta$ -reduces to Q, which is  $\beta$ -nf, then Q is  $\beta$ -normal form of P.

## Is every $\lambda$ -expression normalizable?

- Definitely not!
- Let  $L \equiv (\lambda x.xxy)(\lambda x.xxy)$ .

$$L \rightarrow Ly \rightarrow Lyy \rightarrow ...$$

- Let  $P \equiv (\lambda u.v)L$ . P can be reduced in two ways.
  - $P \equiv (\lambda u.v)L \rightarrow ([L/u]v)L \equiv v$
  - $P \rightarrow (\lambda u.v)Ly$ 
    - $\rightarrow$  ( $\lambda u.v$ )Lyy
    - **→** ...
- P has β-nf but also infinite derivation!

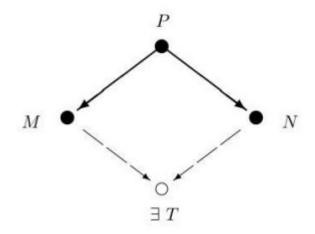
### On evaluation order

- Some λ-expressions can be reduced in more than one way.
- Example:
  - 1)  $(\lambda x.(\lambda y.y x) z) v \rightarrow (\lambda y.y v) z \rightarrow z v$
  - 2)  $(\lambda x.(\lambda y.y x) z) v \rightarrow (\lambda x.z x) v \rightarrow z v$
- Evaluation strategies:
  - Normal form strategie (left-outer redex first)
  - Call by name (no reductions in  $\lambda$ -abstractions + nf)
  - Call by value (outer redex but after right-hand side reduced)

#### Church-Rosser theorem

A central theorem in lambda calculus.

**Theorem**: Let  $P \twoheadrightarrow_{\beta} M$  and  $P \twoheadrightarrow_{\beta} N$ , then there exists T such that  $M \twoheadrightarrow_{\beta} T$  and  $N \twoheadrightarrow_{\beta} T$ .



## Consequences of CR

- $M =_{\beta} N \Rightarrow \exists L: M \Rightarrow_{\beta} L \land N \Rightarrow_{\beta} L$ 
  - M derivation of (derived from) N ⇒ they have the same value
- If N is  $\beta$ -nf of expression M then M  $\rightarrow_{\beta}$  N
  - N is value of M ⇒ there must be a derivation
- Every expression has exactly one β-nf
  - Consistency of  $\lambda$ -calculus:  $\Lambda \not\vdash true =_{\beta} false$

# Properties of LC

- LC is consistent
- LC is equivalent to TM (Turing machine)
  - LC is r.e. language
  - LC is partially computable (not total!)
- LC with types is total function
  - Very limited class of languages
- The characterisation of total TM is not known