

# Lambda Calculus

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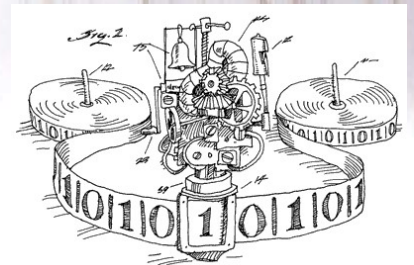
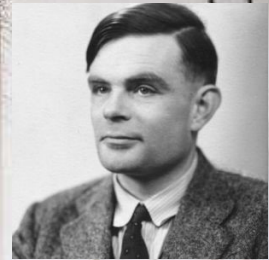
- Anonymous function calculus
- Functional model of computation
- **Alonzo Church** introduced **lambda calculus** in the 1930s.
  - Pure lambda calculus ('30s)
  - Applied & Simply typed lambda calculus('40s)
  - Polymorphic lambda calculus ('70s)



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# Functional Model of Computation

- Express **computation** based on
  - (anonymous) function **abstraction** and
  - function **application** via **binding** and **substitution**.
- Equivalent to state-based **Turing Machine** by Alan Turing.
- Functional languages Lisp, ML, Haskell, F#, Clojure, Scala, etc. are derived from lambda calculus.



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## Syntax

Everything in lambda calculus is an expression (**E**).

Lambda expressions are composed of:

- variables ID such as x, y, z, ...
- the abstraction symbols lambda ' $\lambda$ ' and dot '.'
- parentheses ( )

if  $M, N \in E$ , then

**rule 1:**  $E ::= ID$

**rule 2:**  $E ::= \lambda ID . M$

**rule 3:**  $E ::= (M N)$

**rule 4:**  $E ::= (E)$

†Pure lambda calculus does not define constants, types, operators, etc.

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# Church Encodings!

Booleans, integers, and (other data structures) can be entirely replaced by functions!

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# Turing Complete

- Boolean Logic
- Arithmetic
- Loops

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## Boolean Logic

- $\text{TRUE} = \lambda x . \lambda y . X$
- $\text{FALSE} = \lambda x . \lambda y . Y$
- $\text{COND} = \lambda p . \lambda q . \lambda r . p \ q \ r$
- $\text{AND} := \lambda a . \lambda b . a \ b \ \text{FALSE}$
- $\text{OR} := \lambda a . \lambda b . a \ \text{TRUE} \ b$
- $\text{NOT} := \lambda a . a \ \text{FALSE} \ \text{TRUE}$

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## Church's Numerals

$0 := \lambda f . \lambda x . x$   
 $1 := \lambda f . \lambda x . f \ x$   
 $2 := \lambda f . \lambda x . f \ (f \ x)$   
 $3 := \lambda f . \lambda x . f \ (f \ (f \ x))$

...

$\text{succ} = \lambda n . \lambda f . \lambda x . f \ (n \ f \ x)$

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# Arithmetic Operators

- $\text{add} := \lambda m . \lambda n . \lambda f . \lambda x . m f (n f x)$
- $\text{mult} = \lambda n . \lambda m . m (\text{add } n) 0$

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# Loop: Y Combinator

$Y = \lambda f . (\lambda x . f (x x)) (\lambda x . f (x x))$

$Y \text{ foo}$

$\Rightarrow (\lambda f . (\lambda x . f (x x)) (\lambda x . f (x x)) \text{ foo}$	(by definition of $Y$ )
$\Rightarrow (\lambda x . \text{foo } (x x)) (\lambda x . \text{foo } (x x))$	(by <a href="#">β-reduction</a> of $\lambda f$ : applied $Y$ to $\text{foo}$ )
$\Rightarrow \text{foo } ((\lambda x . \text{foo } (x x)) (\lambda x . \text{foo } (x x)))$	(by β-reduction of $\lambda x$ )
$\Rightarrow \text{foo } (Y \text{ foo})$	(by second equality)
$\Rightarrow \text{foo } (\text{foo } (Y \text{ foo}))$	
$\Rightarrow \dots$	
$\Rightarrow \text{foo } (\dots \text{foo } (Y \text{ foo}) \dots)$	

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## Examples

if  $M, N \in E$ , then

**rule 1:**  $E ::= ID$

**rule 2:**  $E ::= \lambda ID . M$

**rule 3:**  $E ::= (M N)$

**rule 4:**  $E ::= (E)$

$x$

$\lambda x . x$

$x y$

$\lambda \lambda x . y$

$\lambda x . y z$

$\text{foo } \lambda \text{ bar} . (\text{foo } (\text{bar baz}))$

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## Disambiguation Rules

Applications are assumed to be **left associative**:

$M N P$  may be written instead of  $((M N) P)$

The body of an abstraction **extends as far right** as possible:

$\lambda x . M N$  means ...

$\lambda x . (M N)$  and not  $(\lambda x . M) N$

$\lambda x . \lambda x . x$  is ...

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

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## Semantics

Every **ID** that we see in lambda calculus is called a **variable**.

$E \rightarrow \lambda \text{ ID } . M$  is called an **abstraction**

The **ID** is the **variable** of the abstraction (also **bind variable**)

**M** is called the **body** of the abstraction

$E \rightarrow M N$

This is called an **application**

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## Semantics (Cont'd)

$\lambda \text{ ID } . M$  defines a new **anonymous function**

This is the reason why called "**Lambda Expressions**" in Java 8 etc.

**ID** is the **formal parameter** of the function

**M** is the **body** of the function

$E \rightarrow M N$ , function **application**, is similar to calling function **M** and setting its formal parameter to be **N**

Application has higher precedence than abstraction:

$\lambda x . A B$  means  $\lambda x . (A B)$ , not  $(\lambda x . A) B$

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# Computation by Rewriting

For now, think of rewriting as *replacing all occurrences of the formal parameter  $x$  in the function with the argument*:

$(\lambda x . + x 1) 2$

$\Rightarrow (+ 2 1)$

$\Rightarrow 3$

This process is called  **$\beta$ -reduction**

*How can  $+$  function be defined if abstractions only accept 1 parameter?*

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# Currying

**Translate** a function that takes *multiple* arguments **into a sequence of functions** that each take a **single** argument.

$\lambda (x, y) . (+ x y)$  // *invalid  $\lambda$ -expression*

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

$(\lambda x . \lambda y . ((+ x) y)) 10 20$

$\Rightarrow (\lambda y . ((+ 10) y)) 20$

$\Rightarrow ((+ 10) 20) = 30$

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# Problems with the naive rewriting rule

Simple rule for rewriting  $(\lambda x . M)N$  was

*“Replace all occurrences of  $x$  in  $M$  with  $N$ ”.*

However, there are two problems with this rule.

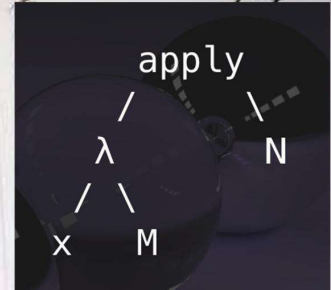
## Problem #1:

"scope escape" problem

=> don't want to replace all occurrences of  $x$

## Problem #2:

"capture" or "name clash" problem



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## Problem #1 (Scope Escape)

Consider the following:

$(\lambda x . (x + ((\lambda x . x + 1) 3))) 2$

Let's rewrite the *inner* expression first.

$(\lambda x . (x + ((\lambda x . x + 1) 3))) 2$

=>  $(\lambda x . (x + (3 + 1))) 2$

=>  $(\lambda x . (x + 4)) 2$

=>  $(2 + 4)$

=> 6

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## Problem # 1 (Scope Escape) (Cont'd)

$(\lambda x . (x + ((\lambda x . x + 1) 3))) 2$

This time, let's rewrite the **outer** expression first.

$(\lambda x . (x + ((\lambda x . x + 1) 3))) 2$

$\Rightarrow (2 + ((\lambda x . 2 + 1) 3))$

$\Rightarrow (2 + (2 + 1))$

$\Rightarrow (2 + 3)$

$\Rightarrow 5$



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## Problem #2

Consider the following:

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

$\Rightarrow (\lambda y . y) z$

$\Rightarrow z$

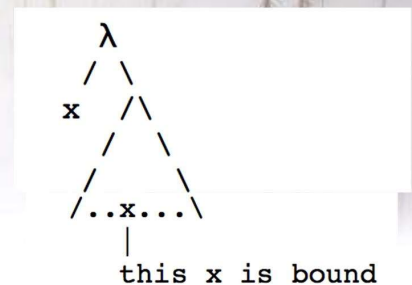
*What should be the correct answer?*

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# The Issue behind Problem #1 is Scoping

To understand how to fix the first problem, we need to understand **scoping**, which involves the following:

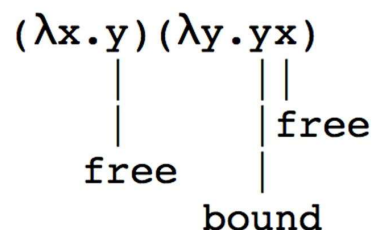
- **Bound Variable**: a variable that is associated with some lambda.
- **Free Variable**: a variable that is *not* associated with any lambda.
- Intuitively, in lambda-expression **M**, variable **x** is **bound** if, in the AST, **x** is in the subtree of a lambda with left child **x**:



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## Free & Bound Variables

The same variable can appear many times in different contexts. Some instances may be bound, others free.



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## Free Variables?

$x$  free in  $\lambda x . x y z$ ?

$y$  free in  $\lambda x . x y z$ ?

$x$  free in  $(\lambda x . (+ x 1)) x$ ?

$z$  free in  $\lambda x . \lambda y . \lambda z . z y x$ ?

$x$  free in  $(\lambda x . z \text{ foo}) (\lambda y . y x)$ ?

$x$  free in  $x \lambda x . x$ ?

$x$  free in  $(\lambda x . x y) x$ ?

$x$  free in  $\lambda x . y x$ ?

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## Combinators

An expression is a **combinator** if it does not have any free variables. The expression is also said to be **closed**.

$\lambda x . \lambda y . x y x$  combinator?

$\lambda x . x$  combinator?

$\lambda z . \lambda x . x y z$  combinator?

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## Revised Rewriting Rule

To solve problem #1 above, given lambda expression  $(\lambda x . M) N$

**“Replace all occurrences of  $x$  in  $M$  with  $N$ .”**

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## Revised Rewriting Rule

To solve problem #1 above, given lambda expression  $(\lambda x . M) N$

**“Replace all occurrences of  $x$  that are free in  $M$  with  $N$ .”**

For example:

$$\begin{array}{c}
 \text{+----- M -----+} \\
 | \qquad \qquad \qquad | \\
 (\lambda x. \quad x + ((\lambda x. x + 1)3)) \quad 2 \\
 | \qquad \qquad \qquad | \\
 \text{free} \qquad \text{bound} \\
 \text{in M} \qquad \text{in M} \\
 \\
 \Rightarrow 2 + ((\lambda x. x + 1)3)
 \end{array}$$

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## The Issue behind Problem #2 is Name Clash

The variable **y** that is *free* in the argument to a  $\lambda$ -expression *becomes bound* after rewriting, because it is put into the scope of a  $\lambda$ -expression with a formal parameter named **y**:

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

free, but gets bound after application

*free argument becomes bound after application!*

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## Equivalence

What does it mean for two functions to be equivalent?

- $\lambda y. y = \lambda x. x$  ?
- $\lambda x. x y = \lambda y. y x$  ?
- $\lambda x. x = \lambda x. x$  ?

*Two expressions that are  $\alpha$ -equivalent must have the same set of free variables.*

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## $\alpha$ -equivalence

**$\alpha$ -equivalence** is when two functions vary only by the names of the bound variables:  $M =_{\alpha} N$

To solve Problem #2, we need a way to rename variables in an expression:

- Simple find and replace?
- $\lambda x. x \lambda y. x y z$ 
  - Can we rename  $x$  to  $\text{foo}$ ?
  - Can we rename  $y$  to  $\text{bar}$ ?
  - Can we rename  $y$  to  $x$ ?
  - Can we rename  $x$  to  $z$ ?

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## $\alpha$ -conversion

*as long as there is no name conflict with other variables*

The basic idea is that formal parameter names are unimportant; so rename them as needed to avoid capture.

**$\alpha$ -conversion** modifies expressions of the form  $\lambda x. M$  to  $\lambda z. M'$ .

**Renames all the occurrences of  $x$  that are *free* in  $M$  to some other variable  $z$  that does not occur in  $M$  (and then  $\lambda x$  is changed to  $\lambda z$ ).**

For example,

$\lambda x. \lambda y. x + y$  *alpha-reduces* to  $\lambda z. \lambda y. z + y$

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# Substitution

Renaming allows us to replace one variable name with another.

However, our goal is to reduce  $(\lambda x . + x 1) 2$  to  $(+ 2 1)$ , which replaces  $x$  with the expression  $2$ .

We need another operator, called **substitution**, to replace a variable by a lambda expression.

- $E[x \rightarrow N]$ , where  $E$  and  $N$  are lambda expressions and  $x$  is a name

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# Substitution

$(\lambda x . + x 1) 2$

$\Rightarrow (+ x 1) [x \rightarrow 2]$

$\Rightarrow (+ 2 1)$

$(\lambda x . (\lambda x . + x 1)) 2$

$\Rightarrow (\lambda x . + x 1) [x \rightarrow 2]$

$\Rightarrow (\lambda x . + x 1)$

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

$\Rightarrow (\lambda x . y x) [y \rightarrow \lambda z . x z]$

$\Rightarrow (\lambda x . (\lambda z . x z) x) \Rightarrow \text{trouble!}$



$\Rightarrow (\lambda w . (\lambda z . x z) w)$



// substitution after alpha-reduction!

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## Substitution Rule

$E [x \rightarrow N]$

1.  $x [x \rightarrow N] = N$
2.  $y [x \rightarrow N] = y$ , if  $x \neq y$
3.  $(E_1 E_2) [x \rightarrow N] = (E_1 [x \rightarrow N]) (E_2 [x \rightarrow N])$
4.  $(\lambda x . E) [x \rightarrow N] = (\lambda x . E)$
5.  $(\lambda y . E) [x \rightarrow N] = (\lambda y . E [x \rightarrow N])$  when  $y \neq x$  and  $y \notin FV(N)$
6.  $(\lambda y . E) [x \rightarrow N] = (\lambda z . E \{z/y\} [x \rightarrow N])$  when  $y \neq x$  and  $y \in FV(N)$ , and  $z \neq x$  and  $z \notin FV(E, N)$

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## Precise Meaning of Rewriting: $\beta$ -reduction

Defined using **substitution** (which in turn uses  $\alpha$ -reduction).

Denoted by  $(\lambda x . M) N \rightarrow_{\beta} M [x \rightarrow N]$

The left-hand side  $(\lambda x . M) N$  is called the **redex**.

The notation means **M** with all **free** occurrences of **x** replaced with **N** in a way that avoids capture.

We say that  $(\lambda x . M) N$  beta-reduces to **M** with **N** substituted for **x**.

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# Normal Form

Computing with  $\lambda$ -expressions involves rewriting them using  $\beta$ -reduction.

A computation is finished when there are **no more redexes**.

**A  $\lambda$ -expression without redexes is in normal form,**

A  $\lambda$ -expression has a normal form *iff* there is some sequence of  $\beta$ -reduction (and/or expansions) that leads to a normal form.

$$E_1 \Rightarrow^* E_2$$

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## $\eta$ -Reduction

If  $v$  is a variable,  $E$  is a lambda expression (denoting a function), and  $v$  has no free occurrence in  $E$ ,

$$\lambda v . (E v) \Rightarrow_{\eta} E$$

$$\lambda x . (\text{sqr } x) \Rightarrow_{\eta} \text{sqr}$$

$$\lambda x . (\text{add } 5 \ x) \Rightarrow_{\eta} (\text{add } 5).$$

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## Interesting Questions

**Q1:** Does every  $\lambda$ -expression have a normal form?

**Q2:** If a  $\lambda$ -expression does have a normal form, can we get there using only  $\beta$ -reductions?

**Q3:** If a  $\lambda$ -expression does have a normal form, do all choices of reduction sequences get there?

**Q4:** Is there a strategy for choosing  $\beta$ -reductions that is guaranteed to result in a normal form if one exists?

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## Q1: Does every $\lambda$ -expression have a normal form?

• No!

$$\begin{aligned} & (\lambda x . x x) (\lambda x . x x) \\ \Rightarrow & (x x) [x \rightarrow (\lambda x . x x)] \\ \Rightarrow & (\lambda x . x x) (\lambda x . x x) \\ \Rightarrow & (x x) [x \rightarrow (\lambda x . x x)] \\ \Rightarrow & (\lambda x . x x) (\lambda x . x x) \\ & \dots \end{aligned}$$

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**Q2: If a  $\lambda$ -expression does have a normal form, can we get there using only beta-reductions?**

- Yes!
- See the “**Church-Rosser Theorem**”.

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**Q3: If a  $\lambda$ -expression does have a normal form, do all choices of reduction sequences get there?**

Consider the following lambda expression:

$$(\lambda x. \lambda y. y) (\underbrace{(\lambda z. zz)(\lambda z. zz)}_{\text{}})$$

The sequence of choices that we make **can** determine whether or not we get to a normal form.

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**Q4: Is there a strategy for choosing  $\beta$ -reductions that is guaranteed to result in a normal form if one exists?**

- Yes!
- **leftmost-outermost** *aka* **normal-order-reduction (NOR)**

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## **Outermost and Innermost Redexes**

**Definition:** An **outermost redex** is a redex that is not contained inside another one. (Similarly, an **innermost redex** is one that has no redexes inside it.)

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## Normal Order Reduction (NOR)

To do a normal-order reduction, always choose the **leftmost** of the **outermost** redexes.

NOR is like **call-by-name** parameter passing, where you evaluate an actual parameter only when the corresponding formal is used.

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## Applicative-Order Reduction (AOR)

Choose the **leftmost** of the **innermost** redexes.

AOR corresponds to **call-by-value** parameter passing: the arguments are reduced before applying the function.

The advantage of AOR is **efficiency**.

The disadvantage is that AOR **may fail to terminate** on a lambda expression that has a normal form.

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# Call-by-Need: Best of Both World

- **Call-by-need** is like call-by-name in that **an actual parameter is only evaluated when the corresponding formal is used ...**
- However, the difference is that when using call-by-need, **the result of the evaluation is saved and is then reused** for each subsequent use of the formal.