

A Cunning Plan

The Lambda Calculus, Lisp, Scheme, and R

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R/Finance 2024-05-18
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Disclaimer

Motivation

Lambda Calculus: Theory

Lambda Calculus: Implementation

References

Disclaimer

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Motivation

What is this?

```
1 Y(\(r) \(n)
2   `zerop?`(n) (C0)
3   (`IF` (eq(n) (C1))
4     (C1)
5     (\(x) add (r( sub(n) (C1) )) (r( sub(n) (C2) )) (x))))
```

```
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4     (C1)
5     (\(x) add (r( sub(n)(C1) )) (r( sub(n)(C2) )) (x)))) (C10) |> .to.integer ()
```

[1] 55

Fibonacci: R

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5     (\(x) add (r( sub(n)(C1) )) (r( sub(n)(C2) )) (x)))) -> fibonacci
6
7 lapply(list(C0, C1, C2, C3, C4, C5, C6, C7, C8, C9, C10),
8         \(n) cat(sprintf("%+2s: %+3s\n", n |> .to.integer(), fibonacci(n) |> .to.integer()))
9         -> dev.null
```

```
0: 0
1: 1
2: 1
3: 2
4: 3
5: 5
6: 8
7: 13
8: 21
9: 34
10: 55
```


Fibonacci: Lisp

```
1 (defun fibonacci (n)
2   (if (or (= n 0) (= n 1)) n
3       (+ (fibonacci (- n 1)) (fibonacci (- n 2)))))
4
5 (let ((x '(0 1 2 3 4 5 6 7 8 9 10)))
6   (mapcar (lambda (x) (princ (format "%2s:%+3s\n" x (fibonacci x)))) x))
```

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What is functional programming?

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- “no side effects...”

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- “use functions, instead of objects...”
- “no side effects...”
- “mumble, mumble...”

Why does functional programming matter?

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 - recursion (no “loops”)
- scalability

R: A Language for Data Analysis and Graphics

ROSS IHAKE and Robert GENTLEMAN

In this article we discuss our experience designing and implementing a statistical computing language. In developing this new language, we sought to combine what we felt were useful features from two existing computer languages. We feel that the new language provides advantages in the areas of portability, computational efficiency, memory management, and scoping.

Key Words: Computer language; Statistical computing.

1. INTRODUCTION

This article discusses some issues involved in the design and implementation of a computer language for statistical data analysis. Our experience with these issues occurred while developing such a language. The work has been heavily influenced by two existing languages—Becker, Chambers, and Wilks' S (1985) and Steel and Sussman's Scheme (1975). We felt that there were strong points in each of these languages and that it would be interesting to see if the strengths could be combined. The resulting language is very similar in appearance to S, but the underlying implementation and semantics are derived from Scheme. In fact, we implemented the language by first writing an interpreter for a Scheme subset and then progressively mutating it to resemble S.

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ARTIFICIAL INTELLIGENCE LABORATORY

AI Memo No. 349

December 1975

SCHEME

AN INTERPRETER FOR EXTENDED LAMBDA CALCULUS

by

Gerald Jay Sussman and Guy Lewis Steele Jr.

Abstract:

Inspired by ACTORS [Greif and Hewitt] [Smith and Hewitt], we have implemented an interpreter for a LISP-like language, SCHEME, based on the lambda calculus [Church], but extended for side effects, multiprocessing, and process synchronization. The purpose of this implementation is tutorial. We wish to:

Source: [Sussman and Steele, 1975]





Lambda Calculus: Theory

- Mathematics

$$x \mapsto x^2$$

- Mathematics

$$x \mapsto x^2$$

- Haskell

1

```
(\x -> x^2) 3
```

9

- Mathematics

$$x \mapsto x^2$$

- Haskell

```
1 (\x -> x^2) 3
```

9

- R

```
1 (\(x) x^2) (3)
```

[1] 9

- Mathematics

$$x \mapsto x^2$$

- Haskell

```
1 (\x -> x^2) 3
```

9

- R

```
1 (function(x) x^2) (3)
```

[1] 9

- Mathematics: constrain x

$$f: x \mapsto x^2, \quad \forall x \in \mathbb{Z}$$

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$$f: x \mapsto x^2, \quad \forall x \in \mathbb{Z}$$

- type is metadata

```
1  :{  
2    f :: Int -> Int  
3    f = \x -> x^2  
4  :}  
5  f 3
```

- Mathematics: constrain x

$$f: x \mapsto x^2, \quad \forall x \in \mathbb{R}$$

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$$f: x \mapsto x^2, \quad \forall x \in \mathbb{R}$$

- type is metadata

```
1  :{  
2    f :: Double -> Double  
3    f = \x -> x^2  
4  :}  
5  f 3.0
```

9.0

- Mathematics: what if there is no constraint on x ?

$$x \mapsto x^2, \quad \forall x \in ???$$

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1

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:type \x -> x^2
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\x -> x^2 :: Num a => a -> a
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`\x -> x^2 :: Num a => a -> a`

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1

```
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```

2

```
  f :: Num a => a -> a
```

3

```
  f x = x^2
```

4

```
  :}
```

5

```
f 3
```


Haskell: What is Num?

- Num is a *type class*

1

```
:info Num
```

```
class Num a where
  (+) :: a -> a -> a
  (-) :: a -> a -> a
  (*) :: a -> a -> a
  negate :: a -> a
  abs :: a -> a
  signum :: a -> a
  fromInteger :: Integer -> a
  {-# MINIMAL (+), (*), abs, signum, fromInteger, (negate | (-)) #-}
-- Defined in 'GHC.Num'
instance Num Word -- Defined in 'GHC.Num'
instance Num Integer -- Defined in 'GHC.Num'
instance Num Int -- Defined in 'GHC.Num'
instance Num Float -- Defined in 'GHC.Float'
instance Num Double -- Defined in 'GHC.Float'
```

Haskell: What is Int?

- Int is a *data constructor*: it is an *instance* of type class Num

1

```
:info Int
```

```
data Int = GHC.Types.I# GHC.Prim.Int# -- Defined in 'GHC.Types'
instance Eq Int -- Defined in 'GHC.Classes'
instance Ord Int -- Defined in 'GHC.Classes'
instance Enum Int -- Defined in 'GHC.Enum'
instance Num Int -- Defined in 'GHC.Num'
instance Real Int -- Defined in 'GHC.Real'
instance Show Int -- Defined in 'GHC.Show'
instance Integral Int -- Defined in 'GHC.Real'
instance Bounded Int -- Defined in 'GHC.Enum'
instance Read Int -- Defined in 'GHC.Read'
```

Haskell: What is Double?

- Double is a *data constructor*: it is an *instance* of type class Num

1

```
:info Double
```

```
data Double = GHC.Types.D# GHC.Prim.Double#
-- Defined in 'GHC.Types'
instance Eq Double -- Defined in 'GHC.Classes'
instance Ord Double -- Defined in 'GHC.Classes'
instance Enum Double -- Defined in 'GHC.Float'
instance Floating Double -- Defined in 'GHC.Float'
instance Fractional Double -- Defined in 'GHC.Float'
instance Num Double -- Defined in 'GHC.Float'
instance Real Double -- Defined in 'GHC.Float'
instance RealFloat Double -- Defined in 'GHC.Float'
instance RealFrac Double -- Defined in 'GHC.Float'
instance Show Double -- Defined in 'GHC.Float'
instance Read Double -- Defined in 'GHC.Read'
```


- Mathematics

$$f: x \mapsto x^2$$

- R

```
1 f<- \(x) x^2
2 f(3)
```

```
[1] 9
```

What if we *only* had anonymous functions? (no *function names*)

- Mathematics

$$x \mapsto x^2$$

- R

1

```
(\ (x) x^2) (3)
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[1] 9

What if we *only* had anonymous functions? (no *numerals*...)

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$\lambda(x) x$

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 - two parts (separated by a dot):

$$\underbrace{\lambda x}_{\text{head}} . \underbrace{x}_{\text{body}}$$

Lambda terms

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Application

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$$\lambda \underbrace{[x := 1]}_{\text{parameter}} . \underbrace{x}_{\text{body}}$$

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$$\begin{aligned} (\lambda z.z)(\lambda y.y) &\stackrel{\alpha}{=} \underbrace{(\lambda x.x)}_{\alpha \text{ equivalence}} (\lambda y.y) \\ &= \lambda[x := \lambda y.y].x \end{aligned}$$

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 - $\lambda x.xy$

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$$\underbrace{\lambda xy.x}_{\text{note}} = \lambda x.(\lambda y.x) = \underbrace{\lambda x.\lambda y.x}_{\text{"currying"}}$$

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- combinators are λ expressions in which there are *no* free variables
- examples
 - combinator (every λ expression in the body occurs in the head):

$$\lambda x.x$$

- combinator (every λ expression in the body occurs in the head):

$$\underbrace{\lambda xy.x}_{\text{note}} = \lambda x.(\lambda y.x) = \underbrace{\lambda x.\lambda y.x}_{\text{"currying"}}$$

- *not* a combinator (y is a free variable: it does not occur in the head):

$$\lambda x.y$$

$$(\lambda xy.x)(ab) = (\lambda x.\lambda y.x)(ab)$$

$$\begin{aligned}(\lambda xy.x)(ab) &= (\lambda x.\lambda y.x)(ab) \\ &= ((\lambda x.\lambda y.x)(a))(b)\end{aligned}$$

$$\begin{aligned}(\lambda xy.x)(ab) &= (\lambda x.\lambda y.x)(ab) \\ &= ((\lambda x.\lambda y.x)(a))(b) \\ &= (\lambda[x := a].\lambda y.x)(b)\end{aligned}$$

$$\begin{aligned}(\lambda xy.x)(ab) &= (\lambda x.\lambda y.x)(ab) \\&= ((\lambda x.\lambda y.x)(a))(b) \\&= (\lambda[x := a].\lambda y.x)(b) \\&\xrightarrow{\beta} (\lambda y.a)(b)\end{aligned}$$

$$\begin{aligned}(\lambda xy.x)(ab) &= (\lambda x.\lambda y.x)(ab) \\&= ((\lambda x.\lambda y.x)(a))(b) \\&= (\lambda[x := a].\lambda y.x)(b) \\&\xrightarrow{\beta} (\lambda y.a)(b) \\&= \lambda[y := b].a\end{aligned}$$

$$\begin{aligned}(\lambda xy.x)(ab) &= (\lambda x.\lambda y.x)(ab) \\&= ((\lambda x.\lambda y.x)(a))(b) \\&= (\lambda[x := a].\lambda y.x)(b) \\&\xrightarrow{\beta} (\lambda y.a)(b) \\&= \lambda[y := b].a \\&\xrightarrow{\beta} a\end{aligned}$$

$$(\lambda xy.y)(ab) = (\lambda x.\lambda y.y)(ab)$$

$$\begin{aligned}(\lambda xy.y)(ab) &= (\lambda x.\lambda y.y)(ab) \\ &= ((\lambda x.\lambda y.y)(a))(b)\end{aligned}$$

$$\begin{aligned}(\lambda xy.y)(ab) &= (\lambda x.\lambda y.y)(ab) \\ &= ((\lambda x.\lambda y.y)(a))(b) \\ &= (\lambda[x := a].\lambda y.y)(b)\end{aligned}$$

$$\begin{aligned}(\lambda xy.y)(ab) &= (\lambda x.\lambda y.y)(ab) \\&= ((\lambda x.\lambda y.y)(a))(b) \\&= (\lambda[x := a].\lambda y.y)(b) \\&\xrightarrow{\beta} (\lambda y.y)(b)\end{aligned}$$

$$\begin{aligned}(\lambda xy.y)(ab) &= (\lambda x.\lambda y.y)(ab) \\&= ((\lambda x.\lambda y.y)(a))(b) \\&= (\lambda[x := a].\lambda y.y)(b) \\&\xrightarrow{\beta} (\lambda y.y)(b) \\&= \lambda[y := b].b\end{aligned}$$

$$\begin{aligned}(\lambda xy.y)(ab) &= (\lambda x.\lambda y.y)(ab) \\&= ((\lambda x.\lambda y.y)(a))(b) \\&= (\lambda[x := a].\lambda y.y)(b) \\&\xrightarrow{\beta} (\lambda y.y)(b) \\&= \lambda[y := b].b \\&\xrightarrow{\beta} b\end{aligned}$$

Divergence: non-terminating λ expressions

- consider

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

- consider

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

$$\lambda[x := (\lambda x.xx)].xx$$

- consider

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

$$\lambda[x := (\lambda x.xx)].xx$$

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

- consider

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

$$\lambda[x := (\lambda x.xx)].xx$$

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

- some λ expressions clearly disallow reduction to normal form: such λ expressions *diverge*

- consider

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

$$\lambda[x := (\lambda x.xx)].xx$$

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

- some λ expressions clearly disallow reduction to normal form: such λ expressions *diverge*
- the λ expression $(\lambda x.xx)(\lambda x.xx)$ is called “omega”

The BNF form summarizes the grammar for the Lambda Calculus:

$$\begin{aligned} \langle \lambda \text{ expression} \rangle &::= \langle \text{variable} \rangle \\ &\quad | \langle \text{application} \rangle \\ &\quad | \langle \text{abstraction} \rangle \end{aligned}$$
$$\langle \text{application} \rangle ::= (\langle \lambda \text{ expression} \rangle) \langle \lambda \text{ expression} \rangle$$
$$\langle \text{abstraction} \rangle ::= \lambda \langle \text{variable} \rangle. \langle \lambda \text{ expression} \rangle$$

Source: [Révész, 1988]

Lambda Calculus: Implementation

`https://github.com/tharte/al`



Source: https://en.wikipedia.org/wiki/Alonzo_Church

- Truth and Falsity

- Truth and Falsity

$$\text{true} \stackrel{\text{def}}{=} T \stackrel{\alpha}{=} \lambda x \lambda y. x$$

- Truth and Falsity

$\text{true} \stackrel{\text{def}}{=} T \stackrel{\alpha}{=} \lambda x \lambda y. x$

$\text{false} \stackrel{\text{def}}{=} F \stackrel{\alpha}{=} \lambda x \lambda y. y$

- Truth and Falsity

$$\text{true} \stackrel{\text{def}}{=} T \stackrel{\alpha}{=} \lambda x \lambda y. x$$

$$\text{false} \stackrel{\text{def}}{=} F \stackrel{\alpha}{=} \lambda x \lambda y. y$$

- if-then-else (the Branching Combinator)

- Truth and Falsity

$$\text{true} \stackrel{\text{def}}{=} T \stackrel{\alpha}{=} \lambda x \lambda y. x$$

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- if-then-else (the Branching Combinator)

$$\text{IF} \stackrel{\text{def}}{=} p(ab)$$

- Truth and Falsity

$$\text{true} \stackrel{\text{def}}{=} T \stackrel{\alpha}{=} \lambda x \lambda y. x$$

$$\text{false} \stackrel{\text{def}}{=} F \stackrel{\alpha}{=} \lambda x \lambda y. y$$

- if-then-else (the Branching Combinator)

$$\text{IF} \stackrel{\text{def}}{=} p(ab)$$

$$p(ab) \stackrel{\beta}{\rightarrow} T(ab) \stackrel{\alpha}{=} (\lambda x \lambda y. x)(ab) \stackrel{\beta}{\rightarrow} a$$

- Truth and Falsity

$$\text{true} \stackrel{\text{def}}{=} T \stackrel{\alpha}{=} \lambda x \lambda y. x$$

$$\text{false} \stackrel{\text{def}}{=} F \stackrel{\alpha}{=} \lambda x \lambda y. y$$

- if-then-else (the Branching Combinator)

$$\text{IF} \stackrel{\text{def}}{=} p(ab)$$

$$p(ab) \stackrel{\beta}{\rightarrow} T(ab) \stackrel{\alpha}{=} (\lambda x \lambda y. x)(ab) \stackrel{\beta}{\rightarrow} a$$

$$p(ab) \stackrel{\beta}{\rightarrow} F(ab) \stackrel{\alpha}{=} (\lambda x \lambda y. y)(ab) \stackrel{\beta}{\rightarrow} b$$

Verify that branching works

Verify that branching works

1

```
IF(true)(\ (a) a)(\ (b) b)
```

$\backslash(a) \ a$

Verify that branching works

1

```
IF(true)(\ (a) a)(\ (b) b)
```

$\backslash(a) \ a$

1

```
IF(false)(\ (a) a)(\ (b) b)
```

$\backslash(b) \ b$

Switching between worlds: .to.logical

1

```
.to.logical
```

```
function (b)
  (IF(b)(TRUE))(FALSE)
<bytecode: 0x55fc452616e0>
<environment: namespace:al>
```

Switching between worlds: `.to.logical`

```
1 .to.logical
```

```
function (b)
  (IF(b) (TRUE)) (FALSE)
<bytecode: 0x55fc452616e0>
<environment: namespace:al>
```

```
1 true |> .to.logical()
```

```
[1] TRUE
```

Switching between worlds: `.to.logical`

```
1 .to.logical
```

```
function (b)
  (IF(b) (TRUE)) (FALSE)
<bytecode: 0x55fc452616e0>
<environment: namespace:al>
```

```
1 true |> .to.logical()
```

```
[1] TRUE
```

```
1 false |> .to.logical()
```

```
[1] FALSE
```


$$\text{and} \stackrel{\text{def}}{=} \lambda x \lambda y. xyF$$

$$\text{and} \stackrel{\text{def}}{=} \lambda x \lambda y. xyF$$

$$xyF \xrightarrow{\beta} (FT)F \xrightarrow{\beta} F$$

$$\text{and} \stackrel{\text{def}}{=} \lambda x \lambda y. xyF$$

$$xyF \xrightarrow{\beta} (FT)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (FF)F \xrightarrow{\beta} F$$

$$\text{and} \stackrel{\text{def}}{=} \lambda x \lambda y. xyF$$

$$xyF \xrightarrow{\beta} (FT)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (FF)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (TF)F \xrightarrow{\beta} F$$

$$\text{and} \stackrel{\text{def}}{=} \lambda x \lambda y. xyF$$

$$xyF \xrightarrow{\beta} (FT)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (FF)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (TF)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (TT)F \xrightarrow{\beta} T$$

$$\text{and} \stackrel{\text{def}}{=} \lambda x \lambda y. xyF$$

$$xyF \xrightarrow{\beta} (FT)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (FF)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (TF)F \xrightarrow{\beta} F$$

$$xyF \xrightarrow{\beta} (TT)F \xrightarrow{\beta} T$$

```
1 and(false)(true) |> .to.logical()
2 and(false)(false) |> .to.logical()
3 and(true)(false) |> .to.logical()
4 and(true)(true) |> .to.logical()
```

```
[1] FALSE
```

```
[1] FALSE
```

```
[1] FALSE
```

```
[1] TRUE
```


$$\text{or} \stackrel{\text{def}}{=} \lambda x \lambda y. x T y$$

$$\text{or} \stackrel{\text{def}}{=} \lambda x \lambda y. xTy$$

$$xTy \stackrel{\beta}{\rightarrow} (F)T(T) \stackrel{\beta}{\rightarrow} T$$

$$\text{or} \stackrel{\text{def}}{=} \lambda x \lambda y. xTy$$

$$xTy \xrightarrow{\beta} (F)T(T) \xrightarrow{\beta} T$$

$$xTy \xrightarrow{\beta} (F)T(F) \xrightarrow{\beta} F$$

$$\text{or} \stackrel{\text{def}}{=} \lambda x \lambda y. xTy$$

$$xTy \xrightarrow{\beta} (F)T(T) \xrightarrow{\beta} T$$

$$xTy \xrightarrow{\beta} (F)T(F) \xrightarrow{\beta} F$$

$$xTy \xrightarrow{\beta} (T)T(F) \xrightarrow{\beta} T$$

$$\text{or} \stackrel{\text{def}}{=} \lambda x \lambda y. xTy$$

$$xTy \xrightarrow{\beta} (F)T(T) \xrightarrow{\beta} T$$

$$xTy \xrightarrow{\beta} (F)T(F) \xrightarrow{\beta} F$$

$$xTy \xrightarrow{\beta} (T)T(F) \xrightarrow{\beta} T$$

$$xTy \xrightarrow{\beta} (T)T(T) \xrightarrow{\beta} T$$

$$\text{or} \stackrel{\text{def}}{=} \lambda x \lambda y. xTy$$

$$xTy \xrightarrow{\beta} (F)T(T) \xrightarrow{\beta} T$$

$$xTy \xrightarrow{\beta} (F)T(F) \xrightarrow{\beta} F$$

$$xTy \xrightarrow{\beta} (T)T(F) \xrightarrow{\beta} T$$

$$xTy \xrightarrow{\beta} (T)T(T) \xrightarrow{\beta} T$$

```
1 or(false)(true) |> .to.logical()
2 or(false)(false) |> .to.logical()
3 or(true)(false) |> .to.logical()
4 or(true)(true) |> .to.logical()
```

[1] TRUE

[1] FALSE

[1] TRUE

[1] TRUE

$$\text{not} \stackrel{\text{def}}{=} pFT$$

$$\text{not} \stackrel{\text{def}}{=} pFT$$

$$pFT \xrightarrow{\beta} (F)FT \xrightarrow{\beta} T$$

$$\text{not} \stackrel{\text{def}}{=} pFT$$

$$pFT \xrightarrow{\beta} (F)FT \xrightarrow{\beta} T$$

$$pFT \xrightarrow{\beta} (T)FT \xrightarrow{\beta} F$$

$$\text{not} \stackrel{\text{def}}{=} pFT$$

$$pFT \xrightarrow{\beta} (F)FT \xrightarrow{\beta} T$$

$$pFT \xrightarrow{\beta} (T)FT \xrightarrow{\beta} F$$

```
1 not(false) |> .to.logical()  
2 not(true) |> .to.logical()
```

```
[1] TRUE
```

```
[1] FALSE
```

$$c0 \stackrel{\text{def}}{=} C_0 \stackrel{\alpha}{=} \lambda f.\lambda x.x \stackrel{\alpha}{=} \lambda x.\lambda y.y = \text{false}$$

$c0 \stackrel{\text{def}}{=} C_0 \stackrel{\alpha}{=} \lambda f. \lambda x. x \stackrel{\alpha}{=} \lambda x. \lambda y. y = \text{false}$

$c1 \stackrel{\text{def}}{=} C_1 \stackrel{\alpha}{=} \lambda f. \lambda x. f(x)$

$$c0 \stackrel{\text{def}}{=} C_0 \stackrel{\alpha}{=} \lambda f. \lambda x. x \stackrel{\alpha}{=} \lambda x. \lambda y. y = \text{false}$$

$$c1 \stackrel{\text{def}}{=} C_1 \stackrel{\alpha}{=} \lambda f. \lambda x. f(x)$$

$$c2 \stackrel{\text{def}}{=} C_2 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(x))$$

$$c0 \stackrel{\text{def}}{=} C_0 \stackrel{\alpha}{=} \lambda f. \lambda x. x \stackrel{\alpha}{=} \lambda x. \lambda y. y = \text{false}$$

$$c1 \stackrel{\text{def}}{=} C_1 \stackrel{\alpha}{=} \lambda f. \lambda x. f(x)$$

$$c2 \stackrel{\text{def}}{=} C_2 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(x))$$

$$c3 \stackrel{\text{def}}{=} C_3 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(f(x)))$$

$$c0 \stackrel{\text{def}}{=} C_0 \stackrel{\alpha}{=} \lambda f. \lambda x. x \stackrel{\alpha}{=} \lambda x. \lambda y. y = \text{false}$$

$$c1 \stackrel{\text{def}}{=} C_1 \stackrel{\alpha}{=} \lambda f. \lambda x. f(x)$$

$$c2 \stackrel{\text{def}}{=} C_2 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(x))$$

$$c3 \stackrel{\text{def}}{=} C_3 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(f(x)))$$

⋮

$$C_0 \stackrel{\text{def}}{=} C_0 \stackrel{\alpha}{=} \lambda f. \lambda x. x \stackrel{\alpha}{=} \lambda x. \lambda y. y = \text{false}$$

$$C_1 \stackrel{\text{def}}{=} C_1 \stackrel{\alpha}{=} \lambda f. \lambda x. f(x)$$

$$C_2 \stackrel{\text{def}}{=} C_2 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(x))$$

$$C_3 \stackrel{\text{def}}{=} C_3 \stackrel{\alpha}{=} \lambda f. \lambda x. f(f(f(x)))$$

⋮

$$\stackrel{\text{def}}{=} C_N \stackrel{\alpha}{=} \lambda f. \lambda x. f^N(x)$$

Switching between worlds: `.to.integer`

Switching between worlds: `.to.integer`

1

```
.to.integer
```

```
function (n)
n(function(x) x + 1)(0)
<bytecode: 0x55fc442ceef0>
<environment: namespace:al>
```

Switching between worlds: `.to.integer`

```
1 .to.integer
```

```
function (n)
n(function(x) x + 1)(0)
<bytecode: 0x55fc442ceef0>
<environment: namespace:al>
```

```
1 C0 |> .to.integer()
2 C1 |> .to.integer()
3 C2 |> .to.integer()
4 C3 |> .to.integer()
```

```
[1] 0
```

```
[1] 1
```

```
[1] 2
```

```
[1] 3
```

Switching between worlds: `.to.integer`

```
1  `.to.integer`<- \(n) n(\(x) x+1)(0)
```

Switching between worlds: .to.integer

1

```
`to.integer` <- \(n) n(\(x) x+1)(0)
```

$$\underbrace{(\lambda f. \lambda x. x)}_{n=C_0} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 0$$

Switching between worlds: .to.integer

1

```
`to.integer`<- \(n) n(\(x) x+1)(0)
```

$$\underbrace{(\lambda f. \lambda x. x)}_{n=C_0} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 0$$

$$\underbrace{(\lambda f. \lambda x. f(x))}_{n=C_1} (\lambda x. x + 1)(0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

Switching between worlds: .to.integer

1

```
`to.integer`<- \(n) n(\(x) x+1)(0)
```

$$\underbrace{(\lambda f. \lambda x. x)}_{n=C_0} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 0$$

$$\underbrace{(\lambda f. \lambda x. f(x))}_{n=C_1} (\lambda x. x + 1)(0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 1$$

Switching between worlds: .to.integer

1

```
`to.integer`<- \(n) n(\(x) x+1)(0)
```

$$\underbrace{(\lambda f. \lambda x. x)}_{n=C_0} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 0$$

$$\underbrace{(\lambda f. \lambda x. f(x))}_{n=C_1} (\lambda x. x + 1) (0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

$$\xrightarrow{\beta} 1$$

$$\underbrace{((\lambda f. \lambda x. f(f(x))))}_{n=C_2} (\lambda x. x + 1) (0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

Switching between worlds: .to.integer

1

```
`to.integer` <- \(n) n(\(x) x+1)(0)
```

$$\underbrace{(\lambda f. \lambda x. x)}_{n=C_0} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 0$$

$$\underbrace{(\lambda f. \lambda x. f(x))}_{n=C_1} (\lambda x. x + 1) (0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

$$\xrightarrow{\beta} 1$$

$$\underbrace{((\lambda f. \lambda x. f(f(x))))}_{n=C_2} (\lambda x. x + 1) (0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

$$\xrightarrow{\beta} \underbrace{(\lambda x. (\lambda x. x + 1) + 1)}_{f(f(x))} \underbrace{(0)}_x$$

Switching between worlds: `.to.integer`

1

```
`to.integer` <- \(n) n(\(x) x+1)(0)
```

$$\underbrace{(\lambda f. \lambda x. x)}_{n=C_0} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x \xrightarrow{\beta} 0$$

$$\underbrace{(\lambda f. \lambda x. f(x))}_{n=C_1} (\lambda x. x + 1) (0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

$$\xrightarrow{\beta} 1$$

$$\underbrace{((\lambda f. \lambda x. f(f(x))))}_{n=C_2} (\lambda x. x + 1) (0) \xrightarrow{\beta} \underbrace{(\lambda x. x + 1)}_f \underbrace{(\lambda x. x + 1)}_f \underbrace{(0)}_x$$

$$\xrightarrow{\beta} \underbrace{(\lambda x. (\lambda x. x + 1) + 1)}_{f(f(x))} \underbrace{(0)}_x$$

$$\xrightarrow{\beta} 2$$

- successor

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

- successor

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

```
1 succ(C0) |> .to.integer()
2 succ(C10) |> .to.integer()
```

```
[1] 1
[1] 11
```

- successor

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

```
1 succ(C0) |> .to.integer()
2 succ(C10) |> .to.integer()
```

```
[1] 1
[1] 11
```

- predecessor

$$\text{pred} \stackrel{\text{def}}{=} \lambda n. \lambda n(\lambda p. \lambda z. z(\text{succ}(p(T)))(p(T)))(\lambda z. z(C_0)(C_0))(F)$$

- successor

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

```
1 succ(C0) |> .to.integer()
2 succ(C10) |> .to.integer()
```

```
[1] 1
[1] 11
```

- predecessor

$$\text{pred} \stackrel{\text{def}}{=} \lambda n. \lambda n(\lambda p. \lambda z. z(\text{succ}(p(T)))(p(T)))(\lambda z. z(C_0)(C_0))(F)$$

```
1 pred(C1) |> .to.integer()
2 pred(C10) |> .to.integer()
```

```
[1] 0
[1] 9
```


- addition

$$\text{add} \stackrel{\text{def}}{=} \lambda nm.(m \text{ succ})n$$

- addition

$$\text{add} \stackrel{\text{def}}{=} \lambda nm.(m \text{ succ})n$$

```
1  add(C0)(C1) |> .to.integer()
2  add(C1)(C2) |> .to.integer()
```

```
[1] 1
```

```
[1] 3
```

- addition

$$\text{add} \stackrel{\text{def}}{=} \lambda nm.(m \text{ succ})n$$

```
1 add(C0) (C1) |> .to.integer()
2 add(C1) (C2) |> .to.integer()
```

```
[1] 1
```

```
[1] 3
```

- subtraction

$$\text{sub} \stackrel{\text{def}}{=} \lambda nm.(m \text{ pred})n$$

■ addition

$$\text{add} \stackrel{\text{def}}{=} \lambda nm.(m \text{ succ})n$$

```
1 add(C0)(C1) |> .to.integer()
2 add(C1)(C2) |> .to.integer()
```

```
[1] 1
```

```
[1] 3
```

■ subtraction

$$\text{sub} \stackrel{\text{def}}{=} \lambda nm.(m \text{ pred})n$$

```
1 sub(C1)(C1) |> .to.integer()
2 sub(C2)(C1) |> .to.integer()
```

```
[1] 0
```

```
[1] 1
```


- multiplication

$$\text{mul} \stackrel{\text{def}}{=} \lambda nm.m(\text{add } n) C_0$$

- multiplication

$$\text{mul} \stackrel{\text{def}}{=} \lambda nm.m(\text{add } n) C_0$$

```
1  mul(C0)(C1) |> .to.integer()
2  mul(C1)(C2) |> .to.integer()
```

```
[1] 0
```

```
[1] 2
```

- multiplication

$$\text{mul} \stackrel{\text{def}}{=} \lambda nm.m(\text{add } n) C_0$$

```
1  mul(C0)(C1) |> .to.integer()
2  mul(C1)(C2) |> .to.integer()
```

```
[1] 0
```

```
[1] 2
```

- exponentiation

$$\text{exp} \stackrel{\text{def}}{=} \lambda nm.mn$$

- multiplication

$$\text{mul} \stackrel{\text{def}}{=} \lambda nm.m(\text{add } n) C_0$$

```
1  mul(C0)(C1) |> .to.integer()
2  mul(C1)(C2) |> .to.integer()
```

```
[1] 0
```

```
[1] 2
```

- exponentiation

$$\text{exp} \stackrel{\text{def}}{=} \lambda nm.mn$$

```
1  exp(C2)(C1) |> .to.integer()
2  exp(C2)(C2) |> .to.integer()
```

```
[1] 2
```

```
[1] 4
```


- is-zero

$$\text{zerop?} \stackrel{\text{def}}{=} \lambda n.n(\lambda m.F) T$$

- is-zero

$$\text{zerop?} \stackrel{\text{def}}{=} \lambda n.n(\lambda m.F) T$$

```
1 `zerop?`(C0) |> .to.logical()
2 `zerop?`(C1) |> .to.logical()
3 `zerop?`(C2) |> .to.logical()
```

```
[1] TRUE
```

```
[1] FALSE
```

```
[1] FALSE
```

- is-zero

$$\text{zerop?} \stackrel{\text{def}}{=} \lambda n.n(\lambda m.F) T$$

```
1 `zerop?`(C0) |> .to.logical()
2 `zerop?`(C1) |> .to.logical()
3 `zerop?`(C2) |> .to.logical()
```

```
[1] TRUE
```

```
[1] FALSE
```

```
[1] FALSE
```

- less-than-or-equal

$$\text{le} \stackrel{\text{def}}{=} \lambda nm.\text{zerop?}(\text{sub}(n)(m))$$

Comparisons

- is-zero

$$\text{zerop?} \stackrel{\text{def}}{=} \lambda n.n(\lambda m.F) T$$

```
1 `zerop?`(C0) |> .to.logical()
2 `zerop?`(C1) |> .to.logical()
3 `zerop?`(C2) |> .to.logical()
```

```
[1] TRUE
[1] FALSE
[1] FALSE
```

- less-than-or-equal

$$\text{le} \stackrel{\text{def}}{=} \lambda nm.\text{zerop?}(\text{sub}(n)(m))$$

```
1 le(C1)(C1) |> .to.logical()
2 le(C1)(C2) |> .to.logical()
3 le(C2)(C1) |> .to.logical()
```

```
[1] TRUE
[1] TRUE
[1] FALSE
```


- is-equal

$$\text{eq} \stackrel{\text{def}}{=} \lambda nm. \text{and}(\text{le}(n)(m))(\text{le}(n)(m))$$

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```
1 eq(C1)(C1) |> .to.logical()
2 eq(C1)(C2) |> .to.logical()
3 eq(C2)(C1) |> .to.logical()
4 eq(C2)(C2) |> .to.logical()
```

```
[1] TRUE
[1] FALSE
[1] FALSE
[1] TRUE
```


the Y-combinator: Curry's paradoxical combinator

$$Y \stackrel{\text{def}}{=} \lambda y. (\lambda x. y(xx)) (\lambda x. y(xx))$$

Recursion with the Y-Combinator

the Y-combinator: Curry's paradoxical combinator

$$Y \stackrel{\text{def}}{=} \lambda y. (\lambda x. y(xx)) (\lambda x. y(xx))$$

apply Y to an arbitrary function F

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$$YF = (\lambda y. (\lambda x. y(xx)) (\lambda x. y(xx))) F$$

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apply Y to an arbitrary function F

$$\begin{aligned} YF &= (\lambda y. (\lambda x. y(xx)) (\lambda x. y(xx))) F \\ &= \lambda[y := F]. (\lambda x. y(xx)) (\lambda x. y(xx)) \end{aligned}$$

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Recursion with the Y-Combinator

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x in $Fx = x$ is called a *fixed point* of F

x ends up back at x when F is applied to x

$$YI = I(YI)$$

$$\begin{aligned} YI &= I(YI) \\ &= (\lambda x.x)(Y(\lambda x.x)) \end{aligned}$$

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$$\begin{aligned} YI &= I(YI) \\ &= (\lambda x.x)(Y(\lambda x.x)) \\ &\quad \lambda[x := Y(\lambda x.x)].x \\ &\xrightarrow{\beta} Y(\lambda x.x) \\ &= YI \end{aligned}$$

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1

```
(\ (y) (\ (x) y(x(x))) (\ (x) y(x(x)))) (\ (x) x)
```

$$\begin{aligned} YI &= I(YI) \\ &= (\lambda x.x)(Y(\lambda x.x)) \\ &\quad \lambda[x := Y(\lambda x.x)].x \\ &\xrightarrow{\beta} Y(\lambda x.x) \\ &= YI \end{aligned}$$

1 `(\y) (\x) y(x(x))) (\x) y(x(x))) (\x) x)`

Error: C stack usage 9522372 is too close to the limit

$$S_n = \sum_{i=0}^{i=n} i$$

$$S_n = \sum_{i=0}^n i = \begin{cases} S_0 & = 0 \\ S_n & = n + S_{n-1} \end{cases}$$

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$$F \stackrel{\text{def}}{=} \lambda r. \lambda n. \text{IF}(\text{`zerop?` } n)(C_0)(\text{add}(n)(r(\text{pred } n)))$$

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```
1 F<- (\(r) \(n) IF('zerop?'(n)) (C0) (add(n)(r(pred(n)))))
2
3 Y(F)(C3) |> .to.integer()
```

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```

1 F<- (\(r) \(n) IF('zerop?'(n)) (C0) (add(n)(r(pred(n)))))
2
3 Y(F)(C3) |> .to.integer()
```

[1] 6

```
1 F<- (\(r) \(n) IF(`zerop?`(n)) (C0) (add(n)(r(pred(n)))))  
2  
3 Y(F)(C3) |> .to.integer()
```

[1] 6

1

```
Y((\ (r) \ (n) IF(`zerop?`(n)) (C0) (add(n)(r(pred(n)))))) (C3) |> .to.integer()
```

[1] 6

```
1  (\(y) (\(x) y(x(x))) (\(x) y(x(x)))) (
2  \(\(r) \(\(n) IF(`zerop?'(n)) (C0) (add(n)(r(pred(n)))) (C3) |> .to.integer()
```

[1] 6

```

1  (\(y) \(x) y(x(x))) \(x) y(x(x))) (
2    \(r) \(n) (
3      \(p) \(x) \(y) p(x)(y)) (
4        \(n) n(\(m) \(x) \(y) y)(\(x) \(y) x))(n)) (
5          \(f) \(x) x) ((\(n) \(m) m(\(n) \(f) \(x) f(n(f)(x)))(n))(n)(
6            r((\(n) n(\(p) \(z) z(\(n) \(f) \(x) f(n(f)(x)))(p(\(x) \(y) x)))(
7              p(\(x) \(y) x)))(z) z(\(f) \(x) x)(\f) \(x) x))(
8                \(x) \(y) y))(n)))) (\f) \(x) f(f(f(x))) |> .to.integer()

```

[1] 6

$$F_n = \begin{cases} F_0 &= 0 \\ F_1 &= 1 \\ F_n &= F_{n-1} + F_{n-2} \end{cases}$$

$$F_n = \begin{cases} F_0 &= 0 \\ F_1 &= 1 \\ F_n &= F_{n-1} + F_{n-2} \end{cases}$$

```
1 Y(\(r) \(n)
2   `zerop?`(n)(C0)
3   (`IF`(eq(n)(C1))
4     (C1)
5     (\(x) add (r( sub(n)(C1) )) (r( sub(n)(C2) )) (x)))) -> fibonacci
6
7 lapply(list(C0, C1, C2, C3, C4, C5, C6, C7, C8, C9, C10),
8   \(n) cat(sprintf("%+2s: %+3s\n", n |> .to.integer(), fibonacci(n) |> .to.integer()))
9   -> dev.null
```

```
0: 0
1: 1
2: 1
3: 2
4: 3
5: 5
6: 8
7: 13
8: 21
9: 34
10: 55
```

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