

# Lambda Calculus

## Your Favorite Language

Probably has lots of features:

- ~~Assignment ( $x = x + 1$ )~~
- ~~Booleans, integers, characters, strings, ...~~
- ~~Conditionals~~
- ~~Loops~~
- ~~return, break, continue~~
- Functions ✓
- Recursion ✓
- References / pointers ✓
- ~~Objects and classes~~
- Inheritance
- ...



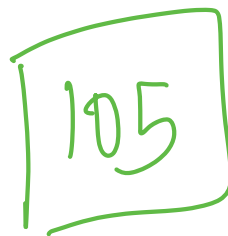
Which ones can we do without?

What is the **smallest universal language**?

*What is computable?*

*Before 1930s*

Informal notion of an **effectively calculable** function:



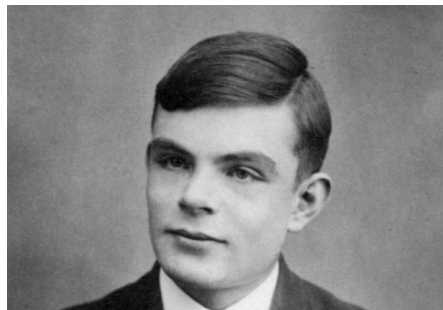
$$\begin{array}{r} 172 \\ 32 \overline{) 5512} \\ \underline{32} \phantom{00} \\ 231 \phantom{0} \\ \underline{224} \phantom{0} \\ 72 \\ \underline{64} \\ 8 \end{array}$$

can be computed by a human with pen and paper, following an algorithm

## 1936: Formalization

What is the **smallest universal language**?

TURING





Alan Turing



Alonzo Church

## *The Next 700 Languages*



Algo 60



Peter Landin

*Whatever the next 700 languages turn out to be, they will surely be variants of lambda calculus.*

Peter Landin, 1966

# *The Lambda Calculus*

Has one feature:

- Functions

No, *really*

- Assignment (  $x = x + 1$  )
- Booleans, integers, characters, strings, ...
- Conditionals

- Loops
- `return`, `break`, `continue`
- Functions
- Recursion
- References / pointers
- Objects and classes
- Inheritance
- Reflection



More precisely, *only thing* you can do is:

- **Define** a function
- **Call** a function



## *Describing a Programming Language*

- *Syntax*: what do programs look like?
- *Semantics*: what do programs mean?
  - *Operational semantics*: how do programs execute step-by-step?

$e ::= x, y, z, \text{apple}, \dots$  variables  
 $| (\lambda x^{\text{in}} \rightarrow e^{\text{out}})$  func

Syntax: What Programs Look Like  $A = \lambda S$   
 $| (e_1 e_2)$   $B = \text{no } \lambda S$

$e ::= x$ $  (\lambda x \rightarrow e)$ $  (e_1 e_2)$	$--$ variable 'x' $--$ function that takes a parameter 'x' and returns $--$ call (function) 'e1' with argument 'e2'
---	---

Programs are **expressions**  $e$  (also called  $\lambda$ -terms) of one of three kinds:

• Variable

- $x, y, z$

$e ::= x$

• Abstraction (aka nameless function definition)

- $(\lambda x \rightarrow e)$
- $x$  is the *formal* parameter,  $e$  is the *body*
- “for any  $x$  compute  $e$ ”

$| \text{function } (x) \{ \text{return } e \}$

• Application (aka function call)

$| e_1(e_2)$

- $(e1\ e2)$
- $e1$  is the *function*,  $e2$  is the *argument*
- in your favorite language:  $e1(e2)$

(Here each of  $e$  ,  $e1$  ,  $e2$  can itself be a variable, abstraction, or application)

## *Examples*

$\text{function } (x) \{ \text{return } x \}$

$(\lambda x \rightarrow x)$

-- The identity function (id) that returns its input

$\text{function } (x) \{ \text{return function } (y) \{ \text{return } y \} \}$ ;

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

-- A function that returns (id)

$(\lambda f \rightarrow (f (\lambda x \rightarrow x)))$  -- A function that applies its argument to id

$\text{fun } (f) \{ \text{return } f (\text{function } (x) \{ \text{return } x \}) \}$

## QUIZ

Which of the following terms are syntactically **incorrect**?

$e = x \mid (\lambda x \rightarrow e) \mid (e_1 \ e_2)$

- ✗ A.  $(\lambda(\lambda(x \rightarrow x)) \rightarrow y)$
- B.  $(\lambda x \rightarrow ((x) x))$
- C.  $(\lambda x \rightarrow (x ((y) x)))$
- D. A and C
- E. all of the above

*Examples*

```
(\x -> x)           -- The identity function (id) that returns its  
input
```

```
(\x -> (\y -> y))    -- A function that returns (id)
```

```
(\f -> (f (\x -> x))) -- A function that applies its argument to id
```

How do I define a function with two arguments?

- e.g. a function that takes x and y and returns y?

```
(\x -> (\y -> y))  -- A function that returns the identity function  
                  -- OR: a function that takes two arguments  
                  -- and returns the second one!
```

How do I apply a function to two arguments?

- e.g. apply `(\x -> (\y -> y))` to apple and banana?

```
(((\x -> (\y -> y)) apple) banana) -- first apply to apple,  
                                     -- then apply the result to banana
```



# Syntactic Sugar

instead of	we write
<code>\x -&gt; (\y -&gt; (\z -&gt; e))</code>	<code>\x -&gt; \y -&gt; \z -&gt; e</code>
<code>\x -&gt; \y -&gt; \z -&gt; e</code>	<code>\x y z -&gt; e</code>
<code>((e1 e2) e3) e4</code>	<code>e1 e2 e3 e4</code>

```
\x y -> y      -- A function that that takes two arguments
                -- and returns the second one...
```

```
(\x y -> y) apple banana -- ... applied to two arguments
```



## *Semantics : What Programs Mean*

How do I “run” / “execute” a  $\lambda$ -term?

Think of middle-school algebra:

$$\begin{aligned} & (1 + 2) * ((3 * 8) - 2) \\ == & \\ & 3 \quad * ((3 * 8) - 2) \\ == & \\ & 3 \quad * (24 \quad - 2) \\ == & \\ & 3 \quad * 22 \\ == & \\ & 66 \end{aligned}$$

**Execute** = rewrite step-by-step

- Following simple *rules*
- until no more rules *apply*

## *Rewrite Rules of Lambda Calculus*

1.  $\beta$ -step (aka *function call*)
2.  $\alpha$ -step (aka *renaming formals*)

But first we have to talk about **scope**

## *Semantics: Scope of a Variable*

The part of a program where a **variable is visible**

In the expression  $(\lambda x \rightarrow e)$

- $x$  is the newly introduced variable
- $e$  is **the scope** of  $x$
- any occurrence of  $x$  in  $(\lambda x \rightarrow e)$  is **bound** (by the **binder**  $\lambda x$ )

For example,  $x$  is bound in:

```
(\x -> x)
```

```
(\x -> (\y -> x))
```

An occurrence of  $x$  in  $e$  is **free** if it's *not bound* by an enclosing abstraction

For example,  $x$  is free in:

```
(x y)                -- no binders at all!
```

```
(\y -> (x y))         -- no  $\lambda x$  binder
```

```
((\x -> (\y -> y)) x) --  $x$  is outside the scope of the  $\lambda x$  binder;  
                      -- intuition: it's not "the same"  $x$ 
```

## QUIZ

Is  $x$  *bound* or *free* in the expression  $((\lambda x \rightarrow x) x)$ ?

- A. first occurrence is bound, second is bound
- B. first occurrence is bound, second is free
- C. first occurrence is free, second is bound
- D. first occurrence is free, second is free

## *EXERCISE: Free Variables*

An variable  $x$  is **free** in  $e$  if *there exists* a free occurrence of  $x$  in  $e$

We can formally define the set of *all free variables* in a term like so:

$$FV(x) = ???$$

$$FV(\lambda x . e) = ???$$

$$FV(e_1 \ e_2) = ???$$

## *Closed Expressions*

If  $e$  has *no free variables* it is said to be **closed**

- Closed expressions are also called **combinators**

What is the shortest closed expression?



# *Rewrite Rules of Lambda Calculus*

1.  $\beta$ -step (aka *function call*)
2.  $\alpha$ -step (aka *renaming formals*)

*Semantics: Redex*

A **redex** is a term of the form

$$((\lambda x \rightarrow e1) e2)$$

A *function*  $(\lambda x \rightarrow e1)$

- $x$  is the *parameter*
- $e1$  is the *returned* expression

*Applied to* an argument  $e2$

- $e2$  is the *argument*

# Semantics: $\beta$ -Reduction

A **redex**  $\beta$ -steps to another term ...

$$(\lambda x \rightarrow e1) e2 \quad \rightarrow \quad e1[x := e2]$$

where  $e1[x := e2]$  means

“  $e1$  with all *free* occurrences of  $x$  replaced with  $e2$  ”

Computation by *search-and-replace*:

If you see an *abstraction* applied to an *argument*,

- In the *body* of the abstraction
- Replace all *free occurrences* of the *formal* by that *argument*

We say that  $(\lambda x \rightarrow e1) e2$   $\beta$ -steps to  $e1[x := e2]$

## *Redex Examples*

`((\x -> x) apple)`

`=b> apple`

Is this right? Ask Elsa (<https://goto.ucsd.edu/elsa/index.html>)

## QUIZ

`((\x -> (\y -> y)) apple)`

=b> ???

- A. `apple`
- B. `\y -> apple`
- C. `\x -> apple`
- D. `\y -> y`
- E. `\x -> y`

## QUIZ

`(\x -> (((y x) y) x)) apple`  
=`b> ???`

- A. `((apple apple) apple) apple`
- B. `((y apple) y) apple`
- C. `((y y) y) y`
- D. `apple`

## QUIZ

`((\x -> (x (\x -> x))) apple)`

=b> ???

- A. `(apple (\x -> x))`
- B. `(apple (\apple -> apple))`
- C. `(apple (\x -> apple))`

D. apple

E.  $(\lambda x. \rightarrow x)$

## *EXERCISE*

What is a  $\lambda$ -term `fill_this_in` such that

```
fill_this_in apple
=> banana
```



ELSA: <https://goto.ucsd.edu/elsa/index.html>

Click here to try this exercise ([https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585434473\\_24432.lc](https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585434473_24432.lc))

*A Tricky One*

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

$=b> \lambda y \rightarrow y$

Is this right?

*Something is Fishy*

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

Is this right?

**Problem:** The *free*  $y$  in the argument has been **captured** by  $\lambda y$  in *body*!

**Solution:** Ensure that *formals* in the body are **different from** *free-variables* of argument!

## *Capture-Avoiding Substitution*

We have to fix our definition of  $\beta$ -reduction:

$$(\lambda x \rightarrow e1) e2 \quad \rightarrow_b \quad e1[x := e2]$$

where  $e1[x := e2]$  means “ ~~$e1$  with all *free* occurrences of  $x$  replaced with  $e2$~~ ”

- $e1$  with all *free* occurrences of  $x$  replaced with  $e2$
- **as long as** no free variables of  $e2$  get captured

Formally:

$$x[x := e] = e$$

$$y[x := e] = y \quad \text{-- as } x \neq y$$

$$(e1\ e2)[x := e] = (e1[x := e])\ (e2[x := e])$$

$$(\lambda x \rightarrow e1)[x := e] = (\lambda x \rightarrow e1) \quad \text{-- Q: Why leave `e1` unchanged?}$$

$$(\lambda y \rightarrow e1)[x := e] \\ \quad | \text{ not } (y \text{ in } FV(e)) = \lambda y \rightarrow e1[x := e]$$

**Oops, but what to do if  $y$  is in the *free-variables* of  $e$ ?**

- i.e. if  $\lambda y \rightarrow \dots$  may *capture* those free variables?

# *Rewrite Rules of Lambda Calculus*

1.  $\beta$ -step (aka *function call*)
2.  $\alpha$ -step (aka *renaming formals*)

## Semantics: $\alpha$ -Renaming

$\lambda x \rightarrow e \quad =_{\alpha} \quad \lambda y \rightarrow e[x := y]$   
**where** not ( $y$  **in**  $FV(e)$ )

- We rename a formal parameter  $x$  to  $y$
- By replace all occurrences of  $x$  in the body with  $y$
- We say that  $\lambda x \rightarrow e$   $\alpha$ -steps to  $\lambda y \rightarrow e[x := y]$

Example:

$(\lambda x \rightarrow x) \quad =_{\alpha} \quad (\lambda y \rightarrow y) \quad =_{\alpha} \quad (\lambda z \rightarrow z)$

All these expressions are  $\alpha$ -**equivalent**

What's wrong with these?

-- (A)

$(\lambda f. \lambda x. f\ x) =_{\alpha} (\lambda x. \lambda x. x)$

-- (B)

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

## Tricky Example Revisited

```
((\x -> (\y -> x)) y)
```

*-- rename 'y' to 'z' to avoid capture*

```
=a> ((\x -> (\z -> x)) y)
```

*-- now do b-step without capture!*

```
=b> (\z -> y)
```

To avoid getting confused,

- you can **always rename** formals,
- so different **variables** have different **names**!



## *Normal Forms*

Recall **redex** is a  $\lambda$ -term of the form

$$((\lambda x \rightarrow e1) e2)$$

A  $\lambda$ -term is in **normal form** if it *contains no redexes*.

# QUIZ

Which of the following term are **not** in *normal form* ?

A.  $x$

B.  $(x\ y)$

C.  $((\lambda x.\ -> x)\ y)$

D.  $(x\ (\lambda y.\ -> y))$

E. C and D

## *Semantics: Evaluation*

A  $\lambda$ -term  $e$  **evaluates to**  $e'$  if

1. There is a sequence of steps

$$e \Rightarrow e_1 \Rightarrow \dots \Rightarrow e_N \Rightarrow e'$$

where each  $\Rightarrow$  is either  $=a>$  or  $=b>$  and  $N \geq 0$

2.  $e'$  is in *normal form*

## *Examples of Evaluation*

$((\lambda x \rightarrow x) \text{ apple})$

$=b> \text{ apple}$

```
(\f -> f (\x -> x)) (\x -> x)
```

```
=?> ???
```

```
(\x -> x x) (\x -> x)
```

```
=?> ???
```

## *Elsa shortcuts*

Named  $\lambda$ -terms:

```
let ID = (\x -> x)  -- abbreviation for (\x -> x)
```

To substitute name with its definition, use a `=d>` step:

```
(ID apple)
```

```
=d> ((\x -> x) apple)  -- expand definition
```

```
=b> apple              -- beta-reduce
```

Evaluation:

- $e1 \Rightarrow e2$  :  $e1$  reduces to  $e2$  in 0 or more steps
  - where each step is `=a>` , `=b>` , or `=d>`
- $e1 \rightsquigarrow e2$  :  $e1$  evaluates to  $e2$  and  $e2$  is **in normal form**

## *EXERCISE*

Fill in the definitions of `FIRST`, `SECOND` and `THIRD` such that you get the following behavior in `elsa`

```
let FIRST  = fill_this_in  
let SECOND = fill_this_in  
let THIRD  = fill_this_in
```

```
eval ex1 :  
  FIRST apple banana orange  
  => apple
```

```
eval ex2 :  
  SECOND apple banana orange  
  => banana
```

```
eval ex3 :  
  THIRD apple banana orange  
  => orange
```

ELSA: <https://goto.ucsd.edu/elsa/index.html>

Click here to try this exercise ([https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585434130\\_24421.lc](https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585434130_24421.lc))

## *Non-Terminating Evaluation*

```
((\x -> (x x)) (\x -> (x x)))
```

```
=b> ((\x -> (x x)) (\x -> (x x)))
```

Some programs loop back to themselves ... *never* reduce to a normal form!

This combinator is called  $\Omega$

What if we pass  $\Omega$  as an argument to another function?

```
let OMEGA = ((\x -> (x x)) (\x -> (x x)))
```

```
((\x -> (\y -> y)) OMEGA)
```

Does this reduce to a normal form? Try it at home!

## *Programming in $\lambda$ -calculus*

*Real languages have lots of features*

- Booleans
- Records (structs, tuples)
- Numbers
- Lists
- **Functions** [we got those]
- Recursion

Lets see how to *encode* all of these features with the  $\lambda$ -calculus.



## *Syntactic Sugar*

instead of	we write
$\backslash x \rightarrow (\backslash y \rightarrow (\backslash z \rightarrow e))$	$\backslash x \rightarrow \backslash y \rightarrow \backslash z \rightarrow e$
$\backslash x \rightarrow \backslash y \rightarrow \backslash z \rightarrow e$	$\backslash x \ y \ z \rightarrow e$
$((e1 \ e2) \ e3) \ e4$	$e1 \ e2 \ e3 \ e4$

```
\x y -> y      -- A function that takes two arguments  
                -- and returns the second one...
```

```
(\x y -> y) apple banana -- ... applied to two arguments
```

##  $\lambda$ -calculus: Booleans

How can we encode Boolean values ( TRUE and FALSE ) as functions?

Well, what do we **do** with a Boolean  $b$  ?

Make a *binary choice*

- **if** *b* **then** *e*<sub>1</sub> **else** *e*<sub>2</sub>

## *Booleans: API*

We need to define three functions

```
let TRUE  = ???  
let FALSE = ???  
let ITE   = \b x y -> ???  -- if b then x else y
```

such that

```
ITE TRUE apple banana ==> apple  
ITE FALSE apple banana ==> banana
```

(Here, **let** NAME = e means NAME is an *abbreviation* for e )

## *Booleans: Implementation*

```
let TRUE  = \x y -> x      -- Returns its first argument
let FALSE = \x y -> y      -- Returns its second argument
let ITE   = \b x y -> b x y -- Applies condition to branches
                                -- (redundant, but improves readability)
```

*Example: Branches step-by-step*

```

eval ite_true:
  ITE TRUE e1 e2
  =d> (\b x y -> b    x  y) TRUE e1 e2    -- expand def ITE
  =b>   (\x y -> TRUE x  y)      e1 e2    -- beta-step
  =b>     (\y -> TRUE e1 y)      e2      -- beta-step
  =b>       TRUE e1 e2            -- expand def TRUE
  =d>     (\x y -> x) e1 e2        -- beta-step
  =b>       (\y -> e1)  e2        -- beta-step
  =b> e1

```

## Example: Branches step-by-step

Now you try it!

Can you fill in the blanks to make it happen? (<http://goto.ucsd.edu:8095/index.html#?demo=ite.lc>)

```
eval ite_false:  
  ITE FALSE e1 e2  
  
  -- fill the steps in!  
  
  =b> e2
```

## *EXERCISE: Boolean Operators*

ELSA: <https://goto.ucsd.edu/elsa/index.html> Click here to try this exercise  
(<https://goto.ucsd.edu>

/elsa/index.html#?demo=permalink%2F1585435168\_24442.lc)

Now that we have ITE it's easy to define other Boolean operators:

```
let NOT = \b      -> ???
```

```
let OR  = \b1 b2 -> ???
```

```
let AND = \b1 b2 -> ???
```

When you are done, you should get the following behavior:



```
eval ex_not_t:  
  NOT TRUE ==> FALSE
```

```
eval ex_not_f:  
  NOT FALSE ==> TRUE
```

```
eval ex_or_ff:  
  OR FALSE FALSE ==> FALSE
```

```
eval ex_or_ft:  
  OR FALSE TRUE ==> TRUE
```

```
eval ex_or_ft:  
  OR TRUE FALSE ==> TRUE
```

```
eval ex_or_tt:  
  OR TRUE TRUE ==> TRUE
```

```
eval ex_and_ff:  
  AND FALSE FALSE ==> FALSE
```

```
eval ex_and_ft:  
  AND FALSE TRUE ==> FALSE
```

```
eval ex_and_ft:  
  AND TRUE FALSE ==> FALSE
```

```
eval ex_and_tt:  
  AND TRUE TRUE ==> TRUE
```

## *Programming in $\lambda$ -calculus*

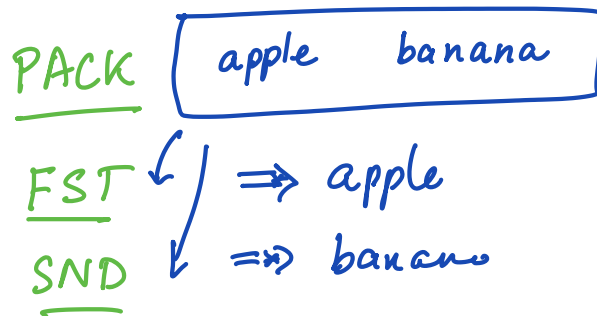
- **Booleans** [done]
- **Records** (structs, tuples)
- Numbers
- Lists

TRUE FALSE

ITE b X1 X2

- **Functions** [we got those]
- Recursion

## Records / Tuples



## $\lambda$ -calculus: Records

Let's start with records with two fields (aka **pairs**)

What do we *do* with a pair?

1. **Pack** two items into a pair, then PACK
2. **Get first** item, or FST
3. **Get second** item. SND

## *Pairs : API*

We need to define three functions

```
let PAIR = \x y -> ???    -- Make a pair with elements x and y
                          -- { fst : x, snd : y }
let FST  = \p -> ???      -- Return first element
                          -- p.fst
let SND  = \p -> ???      -- Return second element
                          -- p.snd
```

such that

```
eval ex_fst:
  FST (PAIR apple banana) => apple

eval ex_snd:
  SND (PAIR apple banana) => banana
```

## *Pairs: Implementation*

A pair of  $x$  and  $y$  is just something that lets you pick between  $x$  and  $y$ !

```
let PAIR = \x y -> (\b -> ITE b x y)
```

i.e.  $\text{PAIR } x \ y$  is a function that

- takes a boolean and returns either  $x$  or  $y$

We can now implement FST and SND by “calling” the pair with `TRUE` or `FALSE`

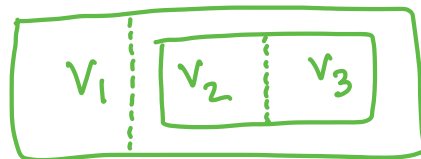
```
let FST  = \p -> p TRUE  -- call w/ TRUE, get first value  
let SND  = \p -> p FALSE -- call w/ FALSE, get second value
```

## EXERCISE: Triples

How can we implement a record that contains **three** values?

ELSA: <https://goto.ucsd.edu/elsa/index.html>

Click here to try this exercise ([https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585434814\\_24436.lc](https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585434814_24436.lc))



$\text{TRIPLE} = \lambda v_1 v_2 v_3 \rightarrow \text{PAIR } v_1 (\text{PAIR } v_2 v_3)$

$\text{FST3} = \lambda \text{tup} \rightarrow \text{FST } \text{tup}$

$\text{SND3} = \lambda \text{tup} \rightarrow \text{FST } (\text{SND } \text{tup})$

$\text{THD3} = \lambda \text{tup} \rightarrow \text{SND } (\text{SND } \text{tup})$

```
let TRIPLE = \x y z -> ???  
let FST3   = \t -> ???  
let SND3   = \t -> ???  
let THD3   = \t -> ???
```

```
eval ex1:  
  FST3 (TRIPLE apple banana orange)  
  => apple
```

```
eval ex2:  
  SND3 (TRIPLE apple banana orange)  
  => banana
```

```
eval ex3:  
  THD3 (TRIPLE apple banana orange)  
  => orange
```



## Programming in $\lambda$ -calculus

- ✓ **Booleans** [done]
- ✓ **Records** (structs, tuples) [done]
- Numbers**
- Lists
- **Functions** [we got those]
- Recursion

3       $\begin{array}{c} f \\ \swarrow \downarrow \searrow \\ x \quad f(x) \quad f(f(x)) \end{array}$

5       $\begin{array}{c} \curvearrowright \quad \curvearrowright \quad \curvearrowright \quad \curvearrowright \quad \curvearrowright \end{array}$

"3"       $\lambda f. x \rightarrow f(f(f(x)))$

"5"       $\lambda f. x \rightarrow f(f(f(f(f(x)))))$

## *$\lambda$ -calculus: Numbers*

Let's start with **natural numbers** (0, 1, 2, ...)

What do we *do* with natural numbers?

- Count: 0, **inc**
- Arithmetic: **dec**, **+**, **-**, **\***
- Comparisons: **==**, **<=**, etc

## *Natural Numbers: API*

We need to define:

- A family of **numerals**: ZERO , ONE , TWO , THREE , ...
- Arithmetic functions: INC , DEC , ADD , SUB , MULT
- Comparisons: IS\_ZERO , EQ

Such that they respect all regular laws of arithmetic, e.g.

```
IS_ZERO ZERO      ==> TRUE
IS_ZERO (INC ZERO) ==> FALSE
INC ONE           ==> TWO
...
```

## Natural Numbers: Implementation

Church numerals: a number  $N$  is encoded as a combinator that calls a  $f$  function on an argument  $N$  times  $\alpha$

let ZERO =  $\lambda f x \rightarrow x$

let ONE =  $\lambda f x \rightarrow f x$

let TWO =  $\lambda f x \rightarrow f (f x)$

let THREE =  $\lambda f x \rightarrow f (f (f x))$

let FOUR =  $\lambda f x \rightarrow f (f (f (f x)))$

let FIVE =  $\lambda f x \rightarrow f (f (f (f (f x))))$

let SIX =  $\lambda f x \rightarrow f (f (f (f (f (f x)))))$

...

" $n$ " =  $\lambda f x \rightarrow \underbrace{f(\dots(f x))}_{\text{"n" times}}$

$(n f x) = \underbrace{f(f(f(\dots(f x))))}_{\text{"n" times}}$

## QUIZ: Church Numerals

Which of these is a valid encoding of ZERO ?

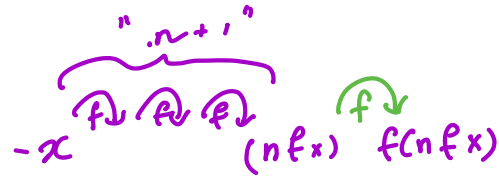
- A: `let ZERO = \f x -> x`  $\equiv \text{FALSE}$
- B: `let ZERO = \f x -> f`
- C: `let ZERO = \f x -> f x`
- ✗ • D: `let ZERO = \x -> x`
- E: None of the above

Does this function look familiar?

# INCREMENT ++

INC ZERO  $\Rightarrow$  ONE

INC ONE  $\Rightarrow$  TWO



let INC = \n  $\rightarrow$  ( $\lambda f\ x \rightarrow \underline{f(nf\ x)}$ )

let INC = \n  $\rightarrow$  ( $\lambda f\ x \rightarrow \underline{f(nf\ x)}$ )

$\lambda$ -calculus: Increment

Diagram illustrating the increment operation. It shows a sequence of applications of a function  $f$  to an initial value  $x$ . A purple bracket labeled  $\text{"}.n+1,\text{"}$  spans over three applications of  $f$ . A green arrow labeled  $f$  points from  $(f\ x)$  to  $f(f\ x)$ .

-- Call 'f' on 'x' one more time than 'n' does

let INC = \n  $\rightarrow$  ( $\lambda f\ x \rightarrow ???$ )

= \n  $\rightarrow$  ( $\lambda f\ x \rightarrow f(n\ f\ x)$ )

= \n  $\rightarrow$  ( $\lambda f\ x \rightarrow n\ f\ (f\ x)$ )

**Example:**

```
eval inc_zero :  
  INC ZERO  
=d> (\n f x -> f (n f x)) ZERO  
=b> \f x -> f (ZERO f x)  
=*> \f x -> f x  
=d> ONE
```

## *EXERCISE*

Fill in the implementation of **ADD** so that you get the following behavior

Click here to try this exercise ([https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585436042\\_24449.lc](https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1585436042_24449.lc))



```
let ZERO = \f x -> x
let ONE  = \f x -> f x
let TWO  = \f x -> f (f x)
let INC  = \n f x -> f (n f x)
```

```
let ADD = fill_this_in
```

```
eval add_zero_zero:
```

```
ADD ZERO ZERO ==> ZERO
```

```
eval add_zero_one:
```

```
ADD ZERO ONE ==> ONE
```

```
eval add_zero_two:
```

```
ADD ZERO TWO ==> TWO
```

```
eval add_one_zero:
```

```
ADD ONE ZERO ==> ONE
```

```
eval add_one_zero:
```

```
ADD ONE ONE ==> TWO
```

```
eval add_two_zero:
```

```
ADD TWO ZERO ==> TWO
```

## QUIZ

 $n$  $m$ 

How shall we implement ADD?

A. **let** ADD =  $\lambda n\ m \rightarrow n\ \text{INC}\ m$ B. **let** ADD =  $\lambda n\ m \rightarrow \text{INC}\ n\ m$ C. **let** ADD =  $\lambda n\ m \rightarrow n\ m\ \text{INC}$ D. **let** ADD =  $\lambda n\ m \rightarrow n\ (m\ \text{INC})$ E. **let** ADD =  $\lambda n\ m \rightarrow n\ (\text{INC}\ m)$ 

$$(((m+1)+1)+1)\dots+1)$$

" $n$  times"

" $m$  times"

$$(n\ \text{INC}\ m)$$

$$(m\ \text{INC}\ n)$$

$$((n\ \text{INC})\ m) \quad \text{vs} \quad (n\ (\text{INC}\ m))$$

$n\ (m+1)$

$$(\lambda f \rightarrow (\lambda x \rightarrow \text{"call } f \text{ " } n \text{ times}))$$

$$\text{INC} (\text{INC} (\text{INC} (\text{INC} \dots (\text{INC}\ m))))$$

" $n$  times"

## $\lambda$ -calculus: Addition

-- Call `f` on `x` exactly `n + m` times

**let** ADD =  $\lambda n\ m \rightarrow n\ \text{INC}\ m$

$(\lambda f\ x \rightarrow n\ f\ (m\ f\ x))$   
 $(\lambda f\ x \rightarrow m\ f\ (n\ f\ x))$

### Example:

eval add\_one\_zero :

ADD ONE ZERO

=> ONE



## QUIZ

How shall we implement `MULT`?

- A. `let MULT = \n m -> n ADD m`
- B. `let MULT = \n m -> n (ADD m) ZERO`
- C. `let MULT = \n m -> m (ADD n) ZERO`
- D. `let MULT = \n m -> n (ADD m ZERO)`
- E. `let MULT = \n m -> (n ADD m) ZERO`

## *$\lambda$ -calculus: Multiplication*

```
-- Call `f` on `x` exactly `n * m` times  
let MULT = \n m -> n (ADD m) ZERO
```

**Example:**

```
eval two_times_three :  
  MULT TWO ONE  
  =~> TWO
```

# *Programming in $\lambda$ -calculus*

- **Booleans** [done]
- **Records** (structs, tuples) [done]
- **Numbers** [done]
- **Lists**
- **Functions** [we got those]
- **Recursion**

## *$\lambda$ -calculus: Lists*

Lets define an API to build lists in the  $\lambda$ -calculus.

### **An Empty List**

NIL

### **Constructing a list**

A list with 4 elements

```
CONS apple (CONS banana (CONS cantaloupe (CONS dragon NIL)))
```

intuitively CONS *h* *t* creates a *new* list with

- *head* *h*
- *tail* *t*

### **Destructing a list**

- HEAD *l* returns the *first* element of the list
- TAIL *l* returns the *rest* of the list

```
HEAD (CONS apple (CONS banana (CONS cantaloupe (CONS dragon NIL))))  
=> apple
```

```
TAIL (CONS apple (CONS banana (CONS cantaloupe (CONS dragon NIL))))  
=> CONS banana (CONS cantaloupe (CONS dragon NIL))
```

*$\lambda$ -calculus: Lists*



```
let NIL  = ???  
let CONS = ???  
let HEAD = ???  
let TAIL = ???
```

```
eval exHd:
```

```
  HEAD (CONS apple (CONS banana (CONS cantaloupe (CONS dragon NIL))))  
=> apple
```

```
eval exTl
```

```
  TAIL (CONS apple (CONS banana (CONS cantaloupe (CONS dragon NIL))))  
=> CONS banana (CONS cantaloupe (CONS dragon NIL))
```

## EXERCISE: *Nth*

Write an implementation of `GetNth` such that

- `GetNth n l` returns the  $n$ -th element of the list `l`

*Assume that `l` has  $n$  or more elements*

```
let GetNth = ???
```

```
eval nth1 :
```

```
  GetNth ZERO (CONS apple (CONS banana (CONS cantaloupe NIL)))  
  =~> apple
```

```
eval nth1 :
```

```
  GetNth ONE (CONS apple (CONS banana (CONS cantaloupe NIL)))  
  =~> banana
```

```
eval nth2 :
```

```
  GetNth TWO (CONS apple (CONS banana (CONS cantaloupe NIL)))  
  =~> cantaloupe
```

Click here to try this in elsa ([https://goto.ucsd.edu/elsa/index.html?demo=permalink%2F1586466816\\_\\_52273.lc](https://goto.ucsd.edu/elsa/index.html?demo=permalink%2F1586466816__52273.lc))

## *$\lambda$ -calculus: Recursion*

I want to write a function that sums up natural numbers up to  $n$  :

```
let SUM = \n -> ...  -- 0 + 1 + 2 + ... + n
```

such that we get the following behavior

```
eval exSum0: SUM ZERO  =~> ZERO
eval exSum1: SUM ONE   =~> ONE
eval exSum2: SUM TWO   =~> THREE
eval exSum3: SUM THREE =~> SIX
```

Can we write sum using **Church Numerals**?

Click here to try this in Elsa ([https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1586465192\\_52175.lc](https://goto.ucsd.edu/elsa/index.html#?demo=permalink%2F1586465192_52175.lc))

## QUIZ

You *can* write SUM using numerals but its *tedious*.

Is this a correct implementation of SUM?

```
let SUM = \n -> ITE (ISZ n)
                  ZERO
                  (ADD n (SUM (DEC n)))
```

A. Yes

**B. No**

No!

- Named terms in Elsa are just syntactic sugar
- To translate an Elsa term to  $\lambda$ -calculus: replace each name with its definition

```
\n -> ITE (ISZ n)
        ZERO
        (ADD n (SUM (DEC n))) -- But SUM is not yet defined!
```

**Recursion:**

- Inside *this* function
- Want to call the *same* function on `DEC n`

Looks like we can't do recursion!

- Requires being able to refer to functions *by name*,
- But  $\lambda$ -calculus functions are *anonymous*.

Right?

# $\lambda$ -calculus: Recursion

Think again!

## Recursion:

Instead of

- Inside *this* function I want to call the *same* function on `DEC n`

Lets try

- Inside *this* function I want to call *some* function `rec` on `DEC n`
- And BTW, I want `rec` to be the *same* function

**Step 1:** Pass in the function to call “recursively”

**let** STEP =

`\rec -> \n -> ITE (ISZ n)`

`ZERO`

`(ADD n (rec (DEC n))) -- Call some rec`

**Step 2:** Do some magic to STEP, so rec is itself

$$\lambda n \rightarrow \text{ITE } (\text{ISZ } n) \text{ ZERO } (\text{ADD } n \text{ (rec (DEC } n)))$$

That is, obtain a term MAGIC such that

$$\text{MAGIC} \Rightarrow \text{STEP MAGIC}$$

*$\lambda$ -calculus: Fixpoint Combinator*



**Wanted:** a  $\lambda$ -term `FIX` such that

- `FIX STEP` calls `STEP` with `FIX STEP` as the first argument:

$(\text{FIX STEP}) \Rightarrow \text{STEP (FIX STEP)}$

(In math: a *fixpoint* of a function  $f(x)$  is a point  $x$ , such that  $f(x) = x$ )

Once we have it, we can define:

**let** `SUM` = `FIX STEP`

Then by property of `FIX` we have:

`SUM`  $\Rightarrow$  `FIX STEP`  $\Rightarrow$  `STEP (FIX STEP)`  $\Rightarrow$  `STEP SUM`

and so now we compute:

```
eval sum_two:
  SUM TWO
  =*> STEP SUM TWO
  =*> ITE (ISZ TWO) ZERO (ADD TWO (SUM (DEC TWO)))
  =*> ADD TWO (SUM (DEC TWO))
  =*> ADD TWO (SUM ONE)
  =*> ADD TWO (STEP SUM ONE)
  =*> ADD TWO (ITE (ISZ ONE) ZERO (ADD ONE (SUM (DEC ONE))))
  =*> ADD TWO (ADD ONE (SUM (DEC ONE)))
  =*> ADD TWO (ADD ONE (SUM ZERO))
  =*> ADD TWO (ADD ONE (ITE (ISZ ZERO) ZERO (ADD ZERO (SUM DEC ZER
0))))
  =*> ADD TWO (ADD ONE (ZERO))
  =*> THREE
```

How should we define FIX ???

## *The Y combinator*

Remember  $\Omega$ ?

```
(\x -> x x) (\x -> x x)
=> (\x -> x x) (\x -> x x)
```

This is *self-replicating code*! We need something like this but a bit more involved...

The Y combinator discovered by Haskell Curry:

```
let FIX  = \stp -> (\x -> stp (x x)) (\x -> stp (x x))
```

How does it work?

```
eval fix_step:
  FIX STEP
  =d> (\stp -> (\x -> stp (x x)) (\x -> stp (x x))) STEP
  =b> (\x -> STEP (x x)) (\x -> STEP (x x))
  =b> STEP ((\x -> STEP (x x)) (\x -> STEP (x x)))
  --          ^^^^^^^^^^^ this is FIX STEP ^^^^^^^^^^^
```

That's all folks, Haskell Curry was very clever.

**Next week:** We'll look at the language named after him (Haskell)

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