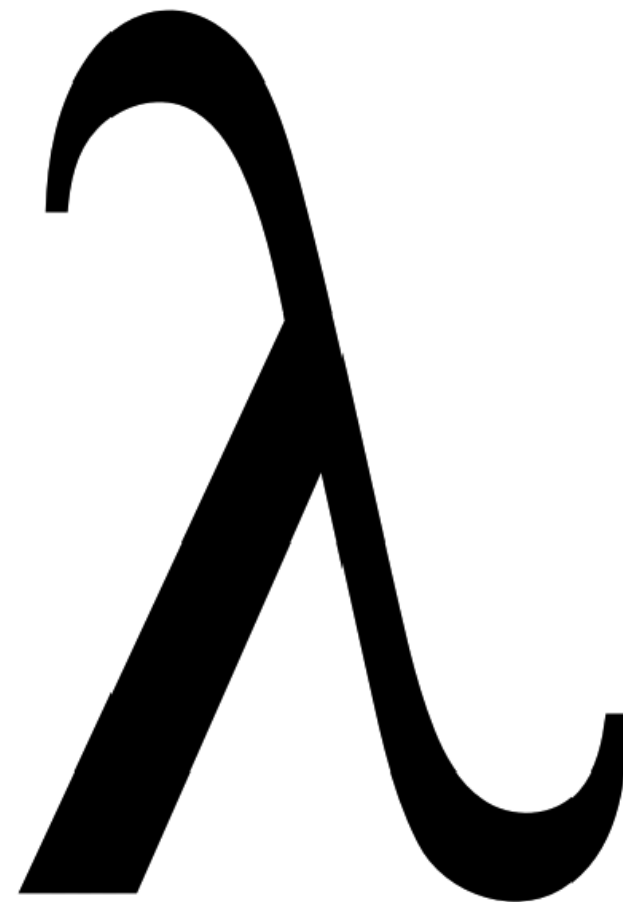


## 5. Introduction to the Lambda Calculus

Oscar Nierstrasz



# Roadmap



- > What is Computability? — Church's Thesis
- > Lambda Calculus — operational semantics
- > The Church-Rosser Property
- > Modelling basic programming constructs

# References

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- > Paul Hudak, “*Conception, Evolution, and Application of Functional Programming Languages*,” ACM Computing Surveys 21/3, Sept. 1989, pp 359-411.
- > Kenneth C. Loudon, *Programming Languages: Principles and Practice*, PWS Publishing (Boston), 1993.
- > H.P. Barendregt, *The Lambda Calculus — Its Syntax and Semantics*, North-Holland, 1984, Revised edition.

# Conception, Evolution, and Application of Functional Programming Languages

<http://scgresources.unibe.ch/Literature/PL/Huda89a-p359-hudak.pdf>

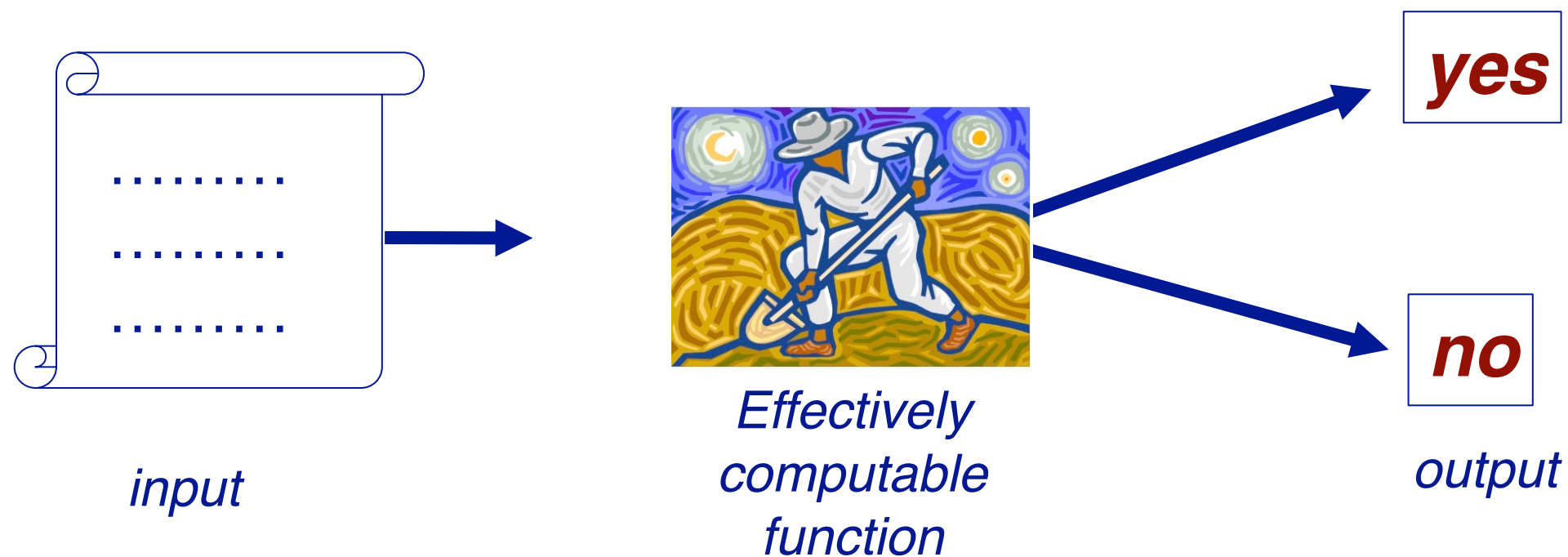
# Roadmap



- > **What is Computability? — Church's Thesis**
- > Lambda Calculus — operational semantics
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- > Modelling basic programming constructs

# What is Computable?

Computation is usually modelled as a *mapping from inputs to outputs*, carried out by a formal “machine,” or program, which processes its input in a *sequence of steps*.



An “effectively computable” function is one that can be computed in a *finite amount of time using finite resources*.

# Church's Thesis

*Effectively computable functions [from positive integers to positive integers] are just those definable in the lambda calculus.*

Or, equivalently:

*It is not possible to build a machine that is more powerful than a Turing machine.*

Church's thesis cannot be proven because “effectively computable” is an *intuitive notion*, not a mathematical one. It can only be refuted by giving a counter-example — a machine that can solve a problem not computable by a Turing machine.

So far, all models of effectively computable functions have shown to be equivalent to Turing machines (or the lambda calculus).

# Uncomputability

A problem that cannot be solved by any Turing machine in finite time (or any equivalent formalism) is called uncomputable.

*Assuming Church's thesis is true, an uncomputable problem cannot be solved by any real computer.*

## ***The Halting Problem:***

*Given an arbitrary Turing machine and its input tape, will the machine eventually halt?*

The Halting Problem is *provably uncomputable* — which means that it cannot be solved in practice.



# What is a Function? (I)

## *Extensional view:*

A (total) function  $f: A \rightarrow B$  is a subset of  $A \times B$  (i.e., a *relation*) such that:

1. for each  $a \in A$ , there exists some  $(a,b) \in f$  (i.e.,  $f(a)$  is *defined*), and
2. if  $(a,b_1) \in f$  and  $(a, b_2) \in f$ , then  $b_1 = b_2$  (i.e.,  $f(a)$  is *unique*)

The extensional view is the database view: a function is a particular *set* of mappings from arguments to values.

# What is a Function? (II)

## *Intensional view:*

A function  $f: A \rightarrow B$  is an *abstraction*  $\lambda x.e$ , where  $x$  is a *variable name*, and  $e$  is an *expression*, such that when a value  $a \in A$  is *substituted* for  $x$  in  $e$ , then this expression (i.e.,  $f(a)$ ) evaluates to some (unique) value  $b \in B$ .

The intensional view is the programmatic view: a function is a *specification* of how to transform the input argument to an output value.

NB: uniqueness does not come for free. The latter view is closer to that of programming languages, since infinite relations can only be represented intensionally.

# Roadmap



- > What is Computability? — Church's Thesis
- > **Lambda Calculus — operational semantics**
- > The Church-Rosser Property
- > Modelling basic programming constructs

# What is the Lambda Calculus?

The Lambda Calculus was invented by Alonzo Church [1932] as a mathematical formalism for expressing computation by functions.

## **Syntax:**

$e ::=$	$x$	<i>a variable</i>
$ $	$\lambda x . e$	<i>an abstraction (function)</i>
$ $	$e_1 e_2$	<i>a (function) application</i>

## **Examples:**

$\lambda x . x$  — is a function taking an argument  $x$ , and returning  $x$

$f x$  — is a function  $f$  applied to an argument  $x$

**NB:** *same as  $f(x)$  !*

We have seen lambda abstractions before in Haskell with a very similar syntax:

```
\ x -> x+1
```

is the anonymous Haskell function that adds 1 to its argument `x`.

Function application in Haskell also has the same syntax as in the lambda calculus:

```
Prelude> (\x ->x+1) 2
```

```
3
```

# Parsing Lambda Expressions

*Lambda extends as far as possible to the right*

$$\lambda f.x\ y \quad \equiv \quad \lambda f.(x\ y)$$

*Application is left-associative*

$$x\ y\ z \quad \equiv \quad (x\ y)\ z$$

*Multiple lambdas may be suppressed*

$$\lambda f\ g.x \quad \equiv \quad \lambda f.\ \lambda g.x$$



# What is the Lambda Calculus? ...

## *(Operational) Semantics:*

$\alpha$ conversion (renaming):	$\lambda x . e \Leftrightarrow \lambda y . [y/x] e$	<i>where <math>y</math> is not free in <math>e</math></i>
$\beta$ reduction (application):	$(\lambda x . e_1) e_2 \rightarrow [e_2/x] e_1$	<i>avoiding name capture</i>
$\eta$ reduction:	$\lambda x . e x \rightarrow e$	<i>if <math>x</math> is not free in <math>e</math></i>

The lambda calculus can be viewed as the simplest possible pure functional programming language.

The  **$\alpha$  conversion** rule simply states that “*variable names don't matter*”. If you define a function with an argument  $x$ , you can change the name of  $x$  to  $y$ , as long as you do it consistently (change every  $x$  to  $y$ ) and avoid name clashes (there must not be another [free]  $y$  in the same scope).

The  **$\beta$  reduction** rule shows *how to evaluate function application*: just (syntactically) replace the formal parameter of the function body by the argument everywhere, taking care to avoid name clashes.

Finally, the  **$\eta$  reduction** rule can be seen as a *renaming optimization*: if the body of a function just applies another function  $f$  to its argument, then we can replace that whole function by  $f$ .

Note that the  $\alpha$  rule only rewrites an expression but does not simplify it. That is why it is called a “conversion” and not a “reduction”.

# Beta Reduction

Beta reduction is the *computational engine* of the lambda calculus:

Define:  $I \equiv \lambda x . x$

Now consider:

$$\begin{aligned} I I &= (\lambda x . x) (\lambda x . x) && \rightarrow [\lambda x . x / x] x && \beta \text{ reduction} \\ & && = \lambda x . x && \text{substitution} \\ & && = I \end{aligned}$$

In the expression:

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

we replace the  $x$  in the body of the first lambda by its argument. The body is simply  $x$ , so we end up with  $(\lambda x . x)$

Let's number each  $x$  to make clear what is happening:

$$(\lambda x_1 . x_2) (\lambda x_3 . x_4)$$

$x_1$  and  $x_3$  are formal parameters, and  $x_2$  and  $x_4$  are the bodies of the two lambda expressions. We are applying the first expression  $(\lambda x_1 . x_2)$  as a function to its argument  $(\lambda x_3 . x_4)$

To do this, we replace the body of  $(\lambda x_1 . x_2)$ , i.e.,  $x_2$ , by the argument  $(\lambda x_3 . x_4)$ . This is written as follows:

$$[ (\lambda x_3 . x_4) / x_2 ] x_2$$

This leaves as the end result:  $(\lambda x_3 . x_4)$  (i.e.,  $(\lambda x . x)$ ).

# Lambda expressions in Haskell

We can implement many lambda expressions directly in Haskell:

```
Prelude> let i = \x -> x
Prelude> i 5
5
Prelude> i i 5
5
```

*How is i i 5 parsed?*

# Lambdas are anonymous functions

A lambda abstraction is just an *anonymous function*.

Consider the Haskell function:

```
compose f g x = f (g x)
```

The *value* of `compose` is the anonymous lambda abstraction:

$$\lambda f g x . f (g x)$$

*NB: This is the same as:*

$$\lambda f . \lambda g . \lambda x . f (g x)$$

```
Prelude> let compose = \f g x -> f(g x)
```

```
Prelude> compose (\x->x+1) (\x->x*2) 5
```

```
11
```

# Free and Bound Variables

The variable  $x$  is bound by  $\lambda$  in the expression:  $\lambda x.e$

A variable that is not bound, is free :

$$\begin{aligned} \text{fv}(x) &= \{ x \} \\ \text{fv}(e_1 e_2) &= \text{fv}(e_1) \cup \text{fv}(e_2) \\ \text{fv}(\lambda x . e) &= \text{fv}(e) - \{ x \} \end{aligned}$$

An expression with no free variables is closed.

(AKA a combinator.) Otherwise it is open.

For example,  $y$  is *bound* and  $x$  is *free* in the (open) expression:

$\lambda y . x y$



You can also think of *bound* variables as being *defined*. The expression

$\lambda x.e$

defines the variable  $x$  within the body  $e$ , just like:

```
int plus(int x, int y) { ... }
```

defines the variables  $x$  and  $y$  within the body of the Java method `plus`.

A variable that is not defined in some outer scope by some lambda is “*free*”, or simply *undefined*.

Closed expressions have no “undefined” variables. In statically typed programming languages, all procedures and programs are normally closed.

# A Few Examples

1.  $(\lambda x.x) y$
2.  $(\lambda x.f x)$
3.  $x y$
4.  $(\lambda x.x) (\lambda x.x)$
5.  $(\lambda x.x y) z$
6.  $(\lambda x y.x) t f$
7.  $(\lambda x y z.z x y) a b (\lambda x y.x)$
8.  $(\lambda f g.f g) (\lambda x.x) (\lambda x.x) z$
9.  $(\lambda x y.x y) y$
10.  $(\lambda x y.x y) (\lambda x.x) (\lambda x.x)$
11.  $(\lambda x y.x y) ((\lambda x.x) (\lambda x.x))$

*Which variables are free?  
Which are bound?*

# “Hello World” in the Lambda Calculus

hello world

 *Is this expression open? Closed?*

# Roadmap



- > What is Computability? — Church's Thesis
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# Why macro expansion is wrong

*Syntactic substitution will not work:*

$$\begin{array}{lll} (\lambda x y . x y) y & \rightarrow [y / x] (\lambda y . x y) & \beta \text{ reduction} \\ & \neq (\lambda y . y y) & \text{incorrect substitution!} \end{array}$$

Since  $y$  is *already bound* in  $(\lambda y . x y)$ , we cannot directly substitute  $y$  for  $x$ .

# Substitution

We must define substitution carefully to avoid *name capture*:

$$[e/x] x = e$$

$$[e/x] y = y \quad \text{if } x \neq y$$

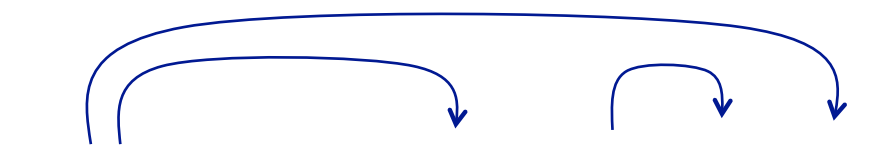
$$[e/x] (e_1 e_2) = ([e/x] e_1) ([e/x] e_2)$$

$$[e/x] (\lambda x . e_1) = (\lambda x . e_1)$$

$$[e/x] (\lambda y . e_1) = (\lambda y . [e/x] e_1) \quad \text{if } x \neq y \text{ and } y \notin \text{fv}(e)$$

$$[e/x] (\lambda y . e_1) = (\lambda z . [e/x] [z/y] e_1) \quad \text{if } x \neq y \text{ and } z \notin \text{fv}(e) \cup \text{fv}(e_1)$$

*Consider:*


$$(\lambda \mathbf{x} . ((\lambda y . \mathbf{x}) (\lambda x . x)) \mathbf{x}) y \rightarrow [y / x] ((\lambda y . \mathbf{x}) (\lambda x . x)) \mathbf{x}$$
$$= ((\lambda \mathbf{z} . y) (\lambda x . x)) y$$

Of these six cases, only the last one is tricky.

If the expression  $e$  (i.e., the argument to our function  $(\lambda y . e_1)$ ) contains a variable name  $y$  that conflicts with the formal parameter  $y$  of our function, then we must first rename  $y$  to a fresh name  $z$  in that function. After renaming  $y$  to  $z$ , there is no longer any conflict with the name  $y$  in our argument  $e$ , and we can proceed safely with the substitution.

# Alpha Conversion

*Alpha conversions allow us to rename bound variables.*

A bound name  $x$  in the lambda abstraction  $(\lambda x.e)$  may be substituted by any other name  $y$ , as long as there are *no free occurrences of  $y$  in  $e$* :

*Consider:*

$$\begin{aligned} (\lambda x y . x y) y &\rightarrow (\lambda x z . x z) y && \alpha \text{ conversion} \\ &\rightarrow [y / x] (\lambda z . x z) && \beta \text{ reduction} \\ &\rightarrow (\lambda z . y z) \\ &= y && \eta \text{ reduction} \end{aligned}$$



# Eta Reduction

Eta reductions allow one to remove “redundant lambdas”.

Suppose that  $f$  is a *closed expression* (i.e., there are no free variables in  $f$ ).

Then:

$$(\lambda x . f x ) y \rightarrow f y \quad \beta \text{ reduction}$$

So,  $(\lambda x . f x )$  behaves the same as  $f$  !

Eta reduction says, *whenever  $x$  does not occur free in  $f$* , we can rewrite  $(\lambda x . f x )$  as  $f$ .

# $\alpha\beta\eta$

	$(\lambda x y . x y) (\lambda x . x y) (\lambda a b . a b)$	<i>NB: left assoc.</i>
$\rightarrow$	$(\lambda x z . x z) (\lambda x . x y) (\lambda a b . a b)$	<i><math>\alpha</math> conversion</i>
$\rightarrow$	$(\lambda z . (\lambda x . x y) z) (\lambda a b . a b)$	<i><math>\beta</math> reduction</i>
$\rightarrow$	$(\lambda x . x y) (\lambda a b . a b)$	<i><math>\beta</math> reduction</i>
$\rightarrow$	$(\lambda a b . a b) y$	<i><math>\beta</math> reduction</i>
$\rightarrow$	$(\lambda b . y b)$	<i><math>\beta</math> reduction</i>
$\rightarrow$	$y$	<i><math>\eta</math> reduction</i>

# Normal Forms

A lambda expression is in normal form *if it can no longer be reduced by beta or eta reduction rules.*

Not all lambda expressions have normal forms!

$$\Omega = (\lambda x . x x) (\lambda x . x x)$$

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

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

*$\beta$  reduction*

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

*$\beta$  reduction*

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

*$\beta$  reduction*

$$\rightarrow \dots$$

Reduction of a lambda expression to a normal form is analogous to a *Turing machine halting* or a *program terminating*.

# A Few Examples

1.  $(\lambda x.x) y$
2.  $(\lambda x.f x)$
3.  $x y$
4.  $(\lambda x.x) (\lambda x.x)$
5.  $(\lambda x.x y) z$
6.  $(\lambda x y.x) t f$
7.  $(\lambda x y z.z x y) a b (\lambda x y.x)$
8.  $(\lambda f g.f g) (\lambda x.x) (\lambda x.x) z$
9.  $(\lambda x y.x y) y$
10.  $(\lambda x y.x y) (\lambda x.x) (\lambda x.x)$
11.  $(\lambda x y.x y) ((\lambda x.x) (\lambda x.x))$

*Are these in normal form?  
Can they be reduced?  
If so, how?*

# Evaluation Order

Most programming languages are strict, that is, *all expressions passed to a function call are evaluated before control is passed to the function.*

Most modern functional languages, on the other hand, use lazy evaluation, that is, *expressions are only evaluated when they are needed.*

*Consider:*

```
sqr n = n * n
```

Applicative-order reduction:

```
sqr (2+5) ⇨ sqr 7 ⇨ 7*7 ⇨ 49
```

Normal-order reduction:

```
sqr (2+5) ⇨ (2+5) * (2+5) ⇨ 7 * (2+5) ⇨ 7 * 7 ⇨ 49
```

# The Church-Rosser Property

*“If an expression can be evaluated at all, it can be evaluated by **consistently using normal-order evaluation**. If an expression can be evaluated in several different orders (mixing normal-order and applicative order reduction), then **all of these evaluation orders yield the same result.**”*

So, evaluation order “does not matter” in the lambda calculus.

# Roadmap



- > What is Computability? — Church's Thesis
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# Non-termination

*However, applicative order reduction may not terminate, even if a normal form exists!*

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

***Applicative order reduction***

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

...

***Normal order reduction***

$$\rightarrow y$$

*Compare to the Haskell expression:*

```
(\x -> \y -> x) 1 (5/0) ⇨ 1
```



# Currying

Since a lambda abstraction only binds a single variable, functions with multiple parameters must be modelled as Curried higher-order functions.

As we have seen, to improve readability, multiple lambdas are suppressed, so:

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

Don't forget that functions written this way are still Curried, so arguments can be bound one at a time!

In Haskell:

```
Prelude> let f = (\ x y -> x) 1
```

```
Prelude> f 2
```

```
1
```

# Representing Booleans

Many programming concepts can be directly expressed in the lambda calculus. Let us define:

$$\begin{aligned}\text{True} &\equiv \lambda x y . x \\ \text{False} &\equiv \lambda x y . y \\ \text{not} &\equiv \lambda b . b \text{ False True} \\ \text{if } b \text{ then } x \text{ else } y &\equiv \lambda b x y . b x y\end{aligned}$$

*then:*

$$\begin{aligned}\text{not True} &= (\lambda b . b \text{ False True} ) (\lambda x y . x ) \\ &\rightarrow (\lambda x y . x ) \text{ False True} \\ &\rightarrow \text{False} \\ \text{if True then } x \text{ else } y &= (\lambda b x y . b x y ) (\lambda x y . x) x y \\ &\rightarrow (\lambda x y . x) x y \\ &\rightarrow x\end{aligned}$$

This is the “standard encoding” of Booleans as lambdas (other encodings are possible).

A Boolean makes a choice between two values, a “true” one and a “false” one. `True` returns the first argument and `False` returns the second.

Negation just reverses the logic, by passing `False` and `True` as arguments to the boolean: `not True` will return `False` and `not False` will return `True`.

# Representing Tuples

Although tuples are not supported by the lambda calculus, they can easily be modelled as higher-order functions that “wrap” pairs of values. n-tuples can be modelled by composing pairs ...

*Define:*

pair	$\equiv$	$(\lambda x y z . z x y)$
first	$\equiv$	$(\lambda p . p \text{ True } )$
second	$\equiv$	$(\lambda p . p \text{ False } )$

*then:*

$(1, 2)$	$=$	pair 1 2
	$\rightarrow$	$(\lambda z . z 1 2)$
first (pair 1 2)	$\rightarrow$	(pair 1 2) True
	$\rightarrow$	True 1 2
	$\rightarrow$	1

The function *pair* takes three arguments. The first two arguments are the  $x$  and  $y$  values of the pair. Since *pair* is a Curried function, passing in  $x$  and  $y$  returns a function (i.e., a pair) that will take a third argument,  $z$ . The body of the pair will pass  $x$  and  $y$  to  $z$ , which can then bind  $x$  and  $y$  and do what it likes with them.

As examples, consider the functions *first* and *second*. Each takes a pair  $p$  as argument and passes it a boolean as the final argument  $z$ . These booleans respectively return  $x$  or  $y$ , i.e., the first or second value in the pair.

*How would you define a lambda expression *sum* that takes a pair  $p$  as argument and returns the sum of the  $x$  and  $y$  values it contains?*

# Tuples as functions

## *In Haskell:*

```
t      = \x -> \y -> x
f      = \x -> \y -> y
pair   = \x -> \y -> \z -> z x y
first  = \p -> p t
second = \p -> p f
```








```
Prelude> first (pair 1 2)
```

```
1
```

```
Prelude> first (second (pair 1 (pair 2 3)))
```





```
2
```

# ***What you should know!***

-  *Is it possible to write a Pascal compiler that will generate code just for programs that terminate?*
-  *What are the alpha, beta and eta conversion rules?*
-  *What is name capture? How does the lambda calculus avoid it?*
-  *What is a normal form? How does one reach it?*
-  *What are normal and applicative order evaluation?*
-  *Why is normal order evaluation called lazy?*
-  *How can Booleans and tuples be represented in the lambda calculus?*



# *Can you answer these questions?*

-  *How can name capture occur in a programming language?*
-  *What happens if you try to program  $\Omega$  in Haskell? Why?*
-  *What do you get when you try to evaluate  $(\text{pred } 0)$ ? What does this mean?*
-  *How would you model numbers in the lambda calculus? Fractions?*



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