

# Dependent Types and the Curry-Howard Correspondence

## Overview: Two Main Points

- ▶ The main point of these lectures will be the so-called Curry-Howard correspondence. The rough idea is that we can identify programs with proofs, and types with propositions.
- ▶ The second main point is that it is possible to create systems with “dependent types” where the types are allowed to depend on the return values of functions.

## Overview: Two Main Points

- ▶ Together, this allows the creation of programming languages where assertions can be proven about the program, in particular it allows for the development of proof assistants.
- ▶ We will aim to delve into the surrounding mathematics, making sure that all of this can be developed in a precise, rigorous and sound way.
- ▶ Specifically one of the main questions will be: when a proof assistant claims that a proof proves a proposition, why can we trust it?

## Dependent Types (Examples)

- ▶ We are all familiar with types: In programming languages they are used to signal what an object represents e.g an integer, or string, and so on.
- ▶ For example imagine that we have a function that determines if an integer is prime or not. Such a function would have the following type:

```
def isPrime : Nat → Bool
```

- ▶ The function itself is what we call a *term*.

# Dependent Types

- ▶ The innovation in dependent types, is that the type can depend on the values of a *term*.
- ▶ For example we can define the *type* of prime numbers, as the set of natural numbers for which `isPrime` returns true:

```
def Prime := { n : Nat // isPrime n = true }
```

- ▶ While `Nat` is a type, `Prime` is a *dependent type*: it's a type that depends on the value of a term (in this case `isPrime`).

## Dependent Types: Applications

- ▶ Now, any function with type signature

```
def listPrimes : Nat → List Prime
```

is guaranteed to return a list of natural numbers for which `isPrime` is always true.

- ▶ This is of course not guaranteed to be correct: your implementation of `isPrime` could be faulty and not always return a prime, you'd need a more refined type to also guarantee the correctness of `isPrime`.

## Dependent Types: Applications

- ▶ Here is another example: In most programming languages one can define trees.
- ▶ In a dependently typed programming language we can define types that correspond to *sorted trees*, thus any function that returns a sorted tree type also has to prove that the tree is sorted in order for the program to compile.

## Curry-Howard Correspondence

- ▶ The idea of dependent types really comes into its own when we combine it with the Curry-Howard correspondence, which allows us to see types as Propositions and programs that inhabit the types as proofs of said propositions.
- ▶ In particular this allows for alternative (constructive) foundations of mathematics, centered around the concept of types.
- ▶ In these foundations we can meaningfully compare proofs of propositions; in classical foundations all proofs have to be identified (by necessity).

## Constructive vs Classical

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Constructive	Classical
Proofs are programs	Proofs are truth certificates
Different algorithms = different proofs	All proofs identified
A proposition is a type (possibly many inhabitants)	A proposition is a boolean (0 or 1 inhabitants)

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# Constructive Logic

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Statement	Constructive Proof Must Provide
$A \vee B$	Which disjunct holds + proof of it
$\exists x.P(x)$	A witness $x$ + proof of $P(x)$
$A \rightarrow B$	A function transforming proofs of $A$ into proofs of $B$

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Proofs are algorithms, and all algorithms are not the same!

# Classical Logic

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Statement	Classical Proof Must Provide
$A \vee B$	Truth certificate that $A \vee B$ holds (no indication which)
$\exists x.P(x)$	Truth certificate that some $x$ exists (no witness)
$A \rightarrow B$	Truth certificate that $A$ implies $B$ (no function)

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## Extensional vs Intensional

- ▶ Classical logic has an extensional view of computation and functions. A function is just defined by what input is mapped to what output.
- ▶ The sentiment here is “it doesn’t matter how X is computed, it only matters that it *can* be computed”.

## Extensional vs Intensional

- ▶ In constructive logic we have an intensional view of computation: we can peek “inside” a function and see how it computes. A function is fundamentally identified with an algorithm.
- ▶ The sentiment here is “we care about how X is computed, for example, some ways are more efficient than others”.

## Extensional vs Intensional

- ▶ We are all familiar with the extensional point of view, but much less so with the intensional way, which in effect requires us to see functions differently, as *algorithms*.
- ▶ This point of view of functions as *computations* rather than plain *maps* is captured by  $\lambda$ -calculus which we will develop next.
- ▶ The  $\lambda$ -calculus is a way to express computation, and it will be the basis for everything that we do next (in particular Lean is heavily dependent on  $\lambda$ -calculus).

## Models of Computation (Motivation)

- ▶ There is no exact definition of what is a computation (in the same way that there is no exact definition of what is randomness).
- ▶ However it is broadly understood that a computation is something that takes an input, performs a number of agreed upon operations on the said input and then gives us an output.

## Models of Computation: Example

- ▶ For example addition of two integers is an example of a computation.
- ▶ We have two inputs, a black-box to which the input is connected, and the output is the sum of the two numbers passed in the input.
- ▶ There is thus an encoding of an input, a sequence of steps (an algorithm) that runs a predetermined set of operations on this input, and a decoding of the output.

## Models of Computation: Conventions

- ▶ We see that for a computation, conventions are important: we have to agree on an encoding and decoding of what the input and output of the “black-box” means.
- ▶ Of course not all computations can be run on our simple black-box that simply adds two numbers. For example, we obviously cannot use it to exponentiate or even multiply two numbers.

## Universal Computation

- ▶ One can therefore ask: is there a “most expressive” computation, a computation such that all other computations can be performed inside of it?
- ▶ One immediately thinks that a computer would have to be “it”.

## Universal Computation

- ▶ A computer clearly fits into our model of a “computation”.  
The input is computer code stored on a hard-drive.
- ▶ The input is then executed, loaded into RAM memory, there is a program counter that fetches an instruction at an address in RAM, executes the instruction, and then increments the program counter and repeats.
- ▶ The simplest mathematical model of a computer is a Turing machine. A variant of a Turing machine is captured by a programming language called “brainfuck”.

## Brainfuck (Turing Machine Model)

Character	Instruction Performed
>	move to cell to the right
<	move to cell to the left
+	increment value at cell modulo 256
-	decrement value of cell modulo 256
.	output byte at current cell
,	input byte and store in current cell
[	if cell byte is zero jump until next ]
]	if cell byte is non-zero jump to previous [

# What a Computer Really Is

Fundamentally this is very simple:

- ▶ we can write to a memory location
- ▶ read from a memory location
- ▶ jump to a new address based on the memory location
- ▶ accept input and write it to a memory location
- ▶ print output based on memory

That's all you need for a computer. This is basically what a Turing machine is.

## Church-Turing Thesis

- ▶ The Church-Turing thesis is that all possible computations can be performed by a computer, in other words that a computer is the most universal “computation” there is.
- ▶ This is a philosophical statement and it cannot be proven.

# Hello World in Brainfuck

```
+++++++[>++++[>++>+++>+++]>+<<<-]>+>->>+[<]<-]>>. >---  
.+++++++.+++.>>. >-. <<-. <-.  
+++.-----.-.-----.>>+. >++. 
```

## Lambda Calculus (Syntax)

- ▶ Lambda calculus is another model of computation which can be proven to be as expressive as the Turing machine one. It was developed by Alonzo Church.
- ▶ This model recognizes that there is something superfluous about a Turing machine. Why do we need an extra RAM component in which we store the state of the computation?

## Lambda Calculus

- ▶ Why can't we just get the output by repeated direct transformation of the input?
- ▶ Since we aim to only transform the input to an output (without an intermediate notion of RAM memory or state) everything will be expressed in terms of functions.

# Lambda Calculus

- ▶ This model of computation is the foundation of *functional programming languages* (e.g Lisp, Ocaml, Haskell, Lean, Agda, and so on).
- ▶ *Imperative programming languages* (e.g C, C++, Java, Python, Rust, and so on) are modelled after a Turing machine.

## Lambda Terms: Variables

- ▶ We now describe the set  $\Lambda$  of valid expressions in Lambda calculus. These are called *lambda terms*.
- ▶ First there are variables, we can agree that any alpha-numeric symbol such as  $a$ ,  $b$ , or  $a1$  is a valid variable. We call this set  $V$ .
- ▶ If  $a \in V$  then  $a \in \Lambda$ . In other words all variables are valid Lambda terms.

## Lambda Terms: Application

- ▶ Second there is composition of Lambda terms, if  $M \in \Lambda$  and  $N \in \Lambda$  then  $MN$  is also a valid lambda term, that is  $MN \in \Lambda$ .
- ▶ Note that we have not assigned any *meaning* to  $MN$  we are just asserting that this is *valid* term, i.e a valid encoding, if you wish.
- ▶ Thus for example if  $x$  is a variable then  $xx$  is a valid  $\lambda$ -term.

## Lambda Terms: Abstraction

- ▶ Third, there are so-called  $\lambda$ -abstractions. If  $u$  is a variable, i.e  $u \in V$  and  $M$  is a valid lambda term i.e  $M \in \Lambda$  then

$$\lambda u.M$$

is a valid lambda-term.

- ▶ Again we have not specified the meaning of this. We are just defining valid encodings.

## Lambda Terms: BNF Grammar

- ▶ This set of valid encodings is usually succinctly written as

$$\Lambda = V \mid \Lambda \Lambda \mid (\lambda V. \Lambda)$$

- ▶ Anything in  $V$  is a valid term, if you have two valid terms  $M$  and  $N$  then  $MN$  is also a valid term, and if you have a variable  $a$  and a valid term  $M$  then  $\lambda a. M$  is also a valid term.

## Lambda Terms: BNF Grammar

- ▶ We have thus defined the set of valid  $\lambda$ -terms but we have not assigned any meaning to them.
- ▶ This is similar to saying that anything composed of letters between  $a$  and  $z$  gives you a “word”, but the “word” might have no meaning yet!

## Lambda Terms: Examples

These are all valid  $\lambda$ -terms:

$$\lambda x.x y$$

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

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

## Beta Reduction (Semantics)

- ▶ In fact the meaning of the lambda term will have to be a matter of our interpretation, we will have to decide that such and such  $\lambda$ -terms means something to us. The assignment of meaning will be up to us!
- ▶ What will not be up to us, however, is how we perform computations once we are given a  $\lambda$ -term.

## Beta Reduction (Semantics)

- ▶ We will now specify how computation is performed on a set of valid  $\lambda$ -terms. This is thus the second side of the picture, the rules of performing computations on a valid  $\lambda$ -term.

## The $\beta$ -Reduction Rule

- ▶ Essentially computation is performed by a process called  $\beta$ -reduction. The only rule is that when we see a term of the form

$$(\lambda x.M)N$$

then this evaluates to  $M$  with every occurrence of  $x$  inside  $M$  replaced by  $N$ .

## $\beta$ -Reduction Examples

$$(\lambda x.xy)u \longrightarrow uy$$

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

The second example evaluates to itself — this is an infinite loop, this computation never terminates.

## Encodings: Booleans

- ▶ We can first declare that we encode *true* and *false* as

$$\text{TRUE} = \lambda x. \lambda y. x$$

and

$$\text{FALSE} = \lambda x. \lambda y. y$$

## Encodings: IF-THEN-ELSE

- ▶ We can encode IF and ELSE using

$$\text{IF } b \text{ THEN } t \text{ ELSE } e = \lambda b. \lambda t. \lambda e. b t e$$

- ▶ This is a function that takes three arguments b, t and e. If b happens to be TRUE it returns t otherwise e.

## Verifying IF-THEN-ELSE

- ▶ Does this work? Let's check that

IF TRUE THEN  $t$  ELSE  $e$

returns  $t$ . By definition:

$$\text{IF TRUE THEN } t \text{ ELSE } e = (\lambda b. \lambda t'. \lambda e'. b t' e') \text{ TRUE } t e$$

## Verifying IF-THEN-ELSE

This is then

$$(\lambda t'.\lambda e'.\text{TRUE } t' e')t e = (\lambda e'.\text{TRUE } t e')e = \text{TRUE } t e$$

And by definition of TRUE this is

$$(\lambda x.\lambda y.x)t e = (\lambda y.t)e = t$$

The check for FALSE is the same.

# Church Numerals

- ▶ Can we encode integers? Yes, define them as follows:

$$0 = \lambda f. \lambda x. x$$

$$1 = \lambda f. \lambda x. f x$$

$$2 = \lambda f. \lambda x. f(f x)$$

$$3 = \lambda f. \lambda x. f(f(f x))$$

## ISEVEN Function

- ▶ Can we encode a function that given an integer as input will return true or false depending on whether the integer is even?

$$\text{TRUE} = \lambda x. \lambda y. x$$
$$\text{FALSE} = \lambda x. \lambda y. y$$
$$\text{NOT} = \lambda b. b \text{ FALSE TRUE}$$

## ISEVEN Function

Our parity detecting function is:

$$\text{ISEVEN} = \lambda n.n \text{ NOT TRUE}$$

Or in fully expanded form:

$$\text{ISEVEN} = \lambda n.n (\lambda b.b (\lambda x.\lambda y.y) (\lambda x.\lambda y.x)) (\lambda x.\lambda y.x)$$

## Verifying NOT

- ▶ If we look at NOT we should have NOT FALSE = TRUE and NOT TRUE = FALSE. Let's check:

$$\begin{aligned}\text{NOT FALSE} &= (\lambda b. b \text{ FALSE} \text{ TRUE}) \text{ FALSE} \\ &= \text{FALSE} \text{ FALSE} \text{ TRUE}\end{aligned}$$

## Verifying NOT

And this equals:

$$(\lambda x. \lambda y. y) \text{ FALSE } \text{ TRUE} = \text{ TRUE}$$

It works!

## Why ISEVEN Works

- ▶ Recall that an integer  $n$  is a function that takes a function  $f$  and an input  $x$ , and then applies the function  $f$   $n$  times to the input  $x$ .
- ▶ We therefore get:

ISEVEN  $n = n$  NOT TRUE

## Why ISEVEN Works

- ▶ Now  $n$  NOT means that we will apply the NOT function to TRUE  $n$  times.
- ▶ This corresponds to bit flipping. If  $n$  is even we will flip back to true, and if  $n$  is odd we end with false.

## Why ISEVEN Works

Let's check formally:

$$\begin{aligned} n \text{ NOT TRUE} &= (\lambda f. \lambda x. f^n x) \text{ NOT TRUE} \\ &= (\lambda x. \text{NOT}^n x) \text{ TRUE} \\ &= \text{NOT}^n \text{ TRUE} \end{aligned}$$

We know  $\text{NOT } \text{TRUE} = \text{FALSE}$  so this is  $\text{NOT}^{(n-1)} \text{ FALSE}$ . You can finish with a proof by induction.

## Other Operations

There are other important operations; checking that these work is left as an exercise:

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

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

$$\text{MULT} = \lambda m. \lambda n. \lambda f. m(n f)$$

## Brainfuck Multiplication Comparison

Compare the elegant lambda calculus definition:

$$\text{MULT} = \lambda m. \lambda n. \lambda f. m(n\ f)$$

with the equivalent in brainfuck, which needs multiple slides...

## Brainfuck Multiplication: Input

,	Read a into cell 0
>,	Read b into cell 1
<	Back to cell 0

Memory: [a] [b] [0] [0]

## Brainfuck Multiplication: Main Loop

```
[           While a != 0
-
>           Move to b
[->+>+<<]   Copy b → result and temp
                  Memory: [a-1] [0] [result+b] [b]
>>           Move to temp
[-<<+>>]   Move temp → b (restore b)
                  Memory: [a-1] [b] [result+b] [0]
<<           Back to b
<             Back to a
]
                  Memory: [0] [b] [a×b] [0]
```

## Brainfuck Multiplication: Output

```
>>           Move to result  
.           Output
```

► Compact form:

```
,>,<[−>[−>+>+<<]>>[−<<+>>]<<<]>>.
```

## Evaluation Order and Church-Rosser

- ▶ A few theoretical questions raise themselves rather quickly.
- ▶ Nothing prescribes in what order we should perform  $\beta$ -reduction. We could start by reducing the innermost function first, or reduce the outermost functions first.
- ▶ Could it be that we receive different results?

## Evaluation Order: Example

Consider:

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

- ▶ If you reduce the argument first (the inner redex) you will be stuck in an infinite loop, since  $(\lambda z.z z) (\lambda z.z z)$  reduces to itself.
- ▶ If you reduce the outermost function first, you simply get  $y$  (since  $\lambda x.y$  ignores its argument).

## Evaluation Order Matters

- ▶ So the order of evaluation matters!
- ▶ Now it's one thing to get stuck in an infinite loop, but could we actually get different "final" values?
- ▶ If that were the case we would have to throw the entire concept out. What is in fact a "final" value?

## Church-Rosser Theorem

- ▶ The Church-Rosser theorem will give us some answers to these questions.
- ▶ We can always reduce to a common value. This will be clarified in the next lecture.

## Lazy vs Strict Evaluation

- ▶ The order of evaluation is important from a practical point of view.
- ▶ Evaluation from the outside (outermost first) leads to *lazy* programming languages (Haskell) and allows working with infinite structures.
- ▶ Evaluation from the inside (innermost first) leads to *strict* evaluation (OCaml) and has more predictable performance.

## Why Types? (Eliminating Divergence)

- ▶ The discussion of evaluation order introduces the idea of types into the picture.
- ▶ We would like to further constrain our  $\lambda$ -calculus by introducing *types* to eliminate non-terminating evaluations.

## Why Types? (Eliminating Divergence)

- ▶ Our first attempt will be in fact too constraining (we will throw away too many possible programs).
- ▶ But it will be an introduction to the basic idea of this course: we will see a basic instance of the Curry-Howard isomorphism.

## Preview: Simply Typed Lambda Calculus

- ▶ In the next lecture, we will introduce the simply typed lambda calculus (STLC).
- ▶ The key idea is to assign types to terms in such a way that only “well-behaved” programs are allowed.

## Preview: Simply Typed Lambda Calculus

- ▶ A remarkable fact: every well-typed term in STLC terminates!  
This is called the “strong normalization” property.
- ▶ The price we pay: some useful programs (like general recursion) become impossible to express.
- ▶ This tradeoff between expressiveness and safety will be a recurring theme.

# The Curry-Howard Correspondence (Preview)

Type Theory	Logic
Type	Proposition
Term of type A	Proof of proposition A
Function type $A \rightarrow B$	Implication $A \rightarrow B$
Pair type $A \times B$	Conjunction $A \wedge B$
Sum type $A + B$	Disjunction $A \vee B$

This correspondence is the foundation of proof assistants like Lean, Coq, and Agda.