

Introduction to Lambda Calculus

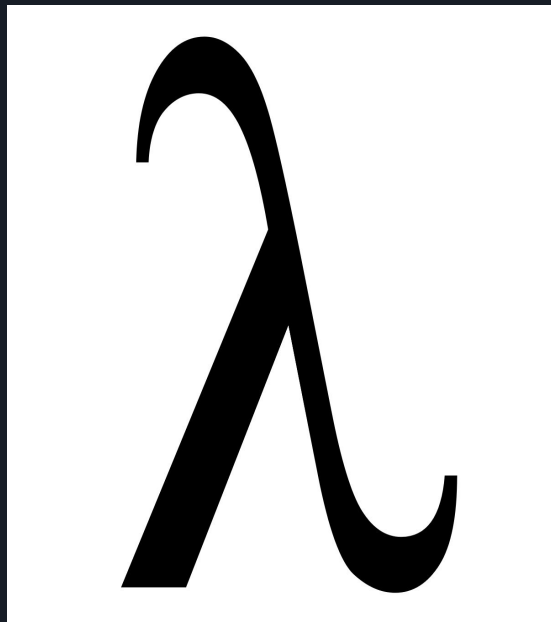
CSCI 3434 Final Presentation

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Outline

Lambda Calculus - “The Smallest Universal Programming Language in the World”

- **Developmental History**
- **Description**
- **Modern Connection**



Origins + Development

Lambda Calculus was developed by Alonzo Church in the 1930s.

Created to investigate nature of computation & the Entscheidungsproblem (undecidability problem)

Also a significant development in Mathematics as it gave a formal way of defining functions.



What is Lambda Calculus?

Lambda Calculus is a *formal system in mathematical logic and computer science for expressing computation based on function abstraction and application.*

Universal model of computation - basis for the theoretical limit of Computability.

Turing Machines and Lambda Calculus are equal in computational power

Church-Turing Thesis -

“Every effectively calculable function is a computable function.”

Components

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

Variables

- Represent all basic primitive types
- Independent of name
- Free or bound

Abstractions

- Function Definitions
- “Binding” of variables
- Define the scope of a variable

Applications

- Calling a function
- Expression is applied to another

Notational Clarity

- Parentheses keep expressions separate
- Curried Functions

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

Reductions

$$\lambda x.x \longleftrightarrow \lambda y.y$$

$$(\lambda x.e_1)e_2 \longleftrightarrow [e_2/x]e_1$$

$$\lambda x.(ex) \longleftrightarrow e \quad \text{if } x \notin fv(e)$$

Goal: Reach Normal Form

α - reductions (renaming)

- Mostly used to maintain function scope

β - reductions (substitutions)

- Used for applications
- Replaces all instances of a variable
- Normal Order vs Applicative Order (ambiguity)

η - reductions (simplifications)

- Not as common
- Not used for actual computation

Boolean Logic

- Many different possible definitions for primitives
- Not defined intuitively, but functionally

$$\mathbf{T} \equiv \lambda xy.x$$

- Returns the first argument of an application
- Returns the constant function with only one application

$$\mathbf{F} \equiv \lambda xy.y$$

- Returns the second argument of an application
- Returns the identity function with only one application

$$\wedge \equiv \lambda xy.xy\mathbf{F}$$

$$\vee \equiv \lambda xy.x\mathbf{T}y$$

$$\neg \equiv \lambda x.x\mathbf{F}\mathbf{T}$$

- Analyze the behavior of the x variable

- Allows for the definition of if-then-else blocks

Church Numerals and Arithmetic

$$0 \equiv \lambda f x. x$$

$$1 \equiv \lambda f x. f(x)$$

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

\vdots

$$n \equiv \lambda f x. f^{(n)}(x)$$

- Curried function that results in n applications of a function
- Can be applied to a function and argument for repeated calls
- 0 only returns the second argument

$$nfa \rightarrow (\lambda gx. g^{(n)}(x))fa \rightarrow f^{(n)}(a)$$

$$S \equiv \lambda xyz. x(xyz)$$

$$S0 \rightarrow \lambda yz. 0(0yz) \rightarrow \lambda yz. z \rightarrow 1$$

- Based on the behavior of the expression x

$$n + m = nSm$$

- Repeated application of the successor function

$$n \times m = n(mS)0$$

- Repeated application of the addition function

Recursion

Base Cases:

$$\mathbf{Z} \equiv \lambda x.x\mathbf{F}\neg\mathbf{F}$$

- Tests if the expression x is equal to 0
- FALSE applied 0 times results in NOT
- Otherwise results in the identity

Further Extensions:

- Pairs and Tuples
- Predecessor Function (and Division)
- Equalities/Inequalities
- Integers/Real Numbers

Y Combinator:

$$\mathbf{Y} \equiv \lambda f.(\lambda x.f(xx))(\lambda x.f(xx))$$

$$\mathbf{YR} \rightarrow (\lambda x.\mathbf{R}(xx))(\lambda x.\mathbf{R}(xx)) \rightarrow \mathbf{R}((\lambda x.\mathbf{R}(xx))(\lambda x.\mathbf{R}(xx))) \rightarrow \mathbf{R}(\mathbf{YR})$$

- Strategy to write recursive functions in a non-recursive way
- Function body has no normal form
- Leads to Curry's paradox
- Extends to programming but disqualifies from mathematical consistency

Self Encoding

- Lambda expressions cannot inspect their own arguments
 - a. Ex: the function *isVariable*, called with argument *a*, that returns *True* if *a* is a variable and *False* otherwise, does not exist
 - b. Problematic: lambda calculus seems to have no input validation
- In order to have a self-referential lambda expression *a*, we need to call it with an argument that is an encoding of itself, $\langle a \rangle$

One possible encoding scheme to create any $\langle a \rangle$ uses the following four lambda functions for encoding

$$\text{var } \lambda f. \lambda x. f^{(i)}(x) \rightarrow \langle x_i \rangle$$

$$\text{app } \langle a \rangle \langle b \rangle \rightarrow \langle a b \rangle$$

$$\text{lam } \langle a \rangle \lambda f. \lambda x. f^{(i)}(x) \rightarrow \langle \lambda x_i. a \rangle$$

$$\text{wrap } \langle a \rangle \rightarrow \langle \langle a \rangle \rangle$$

All four of these lambda functions are one-to-one

Self Encoding

We also need the *self* function in order to encode $\langle a \ \langle a \rangle \rangle$

$$\textit{self } x \equiv \textit{app } x (\textit{wrap } x)$$
$$\textit{self } \langle a \rangle \rightarrow \langle a \ \langle a \rangle \rangle$$

Now we can encode our lambda expressions to pass them as arguments to themselves

More Undecidability

Definition: a lambda expression p is a decider for a set of lambda expressions A if for any lambda expression a , applying p to $\langle a \rangle$ returns *True* if a is in A and *False* otherwise

The ability to encode lambda expressions allows us to prove the following theorems:

1. *Any set of lambda expressions which is non-trivial and closed does not have a decider.*
2. *It is undecidable if two arbitrary lambda expressions a and b are beta-equivalent*
3. *It is undecidable if an arbitrary lambda expression a reduces to a normal form (equivalent to the Halting problem)*

Church's Thesis

Church-Rosser Theorems

- If two expressions are intra-convertible, there exists a third expression that they can both be reduced to (can be unchanged, but unique)
- If a normal form of an expression exists, it can always be found (use normal-order)

Equivalency of Models

- Lambda Definable Functions (Church)
- Turing Computable Functions (Turing)
- General Recursive Functions (Gödel)
- All used to show the unsolvability of the Entscheidungsproblem

General Outline of Proof:

- Lambda abstractions to represent the transition function (applied to initial state)
- States to represent variables

“Effectively computable functions from positive integers to positive integers are just those definable in the lambda calculus”

Example Lambda Encoding

Objective - Sort a list

“Imperative” Code

Algorithm 1 - Sort(list A)

```
pivot = first element of A
smaller, equal, greater = [], [], []
for each  $k \in A$  do
    if  $k < \text{pivot}$  then append  $k$  to smaller
    else if  $k > \text{pivot}$  then append  $k$  to greater
    else if  $k = \text{pivot}$  then append  $k$  to equal
    end if
end for
sortedSmaller = Sort(smaller)
sortedGreater = Sort(greater)
return concatenate(sortedSmaller, equal, sortedGreater)
```

Lambda Calculus Expression

$$\text{Sort} = \lambda bcd. (\lambda f x. f(x)) (\lambda f x. f(x)) (\lambda e f. f(\lambda g h i. g(\lambda j. h(\lambda k l. k j(i k l)))) (h i)) e \\ \dots (\lambda g h. h)) (\lambda e. d) (\lambda e. b (\lambda f. e(f(\lambda g h i. h g)(\lambda g h. c f h))))$$

Operates on Church Encoded list of numbers

Example of [1,7,2,3] is seen below

$$(\lambda \text{cons nil.} \\ \quad (\text{cons}(\lambda f x. (f x)) - 1 \\ \quad (\text{cons}(\lambda f x. (f(f(f(f(f(f(f x)))))))) - 7 \\ \quad (\text{cons}(\lambda f x. (f(f x))) - 2 \\ \quad (\text{cons}(\lambda f x. (f(f(f x)))) - 3 \\ \quad \text{nil}))))))$$

Modern Connection - Functional Programming

Lambda Calculus is a basis for more modern “functional programming” languages.

Created by McCarthy in late 1950's with LISP. Modern examples include Haskell, ML, OCaml, Scala.

Properties:

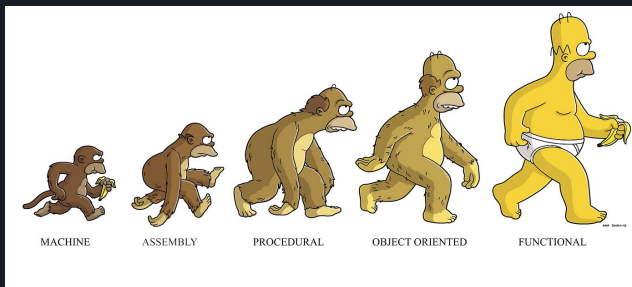
- Declarative style
- Built on immutability (value binding with beta reductions)
- Higher-order functions (currying with functions as input).

Anonymous (Lambda) functions more recently implemented in many imperative programming languages. Examples in Python, C++, MATLAB, etc.

Functional Programming in Industry

Extensions of Lambda Calculus in use today:

- **Google** - Haskell used for internal IT infrastructure support
- **Microsoft** - uses functional programming for production serialization system, Bond
- **Discord** - built almost entirely on Elixir
- **AT&T** - Haskell used in the Network Security division to automate processing of internet abuse complaints
- **Ericsson** - developed Erlang function programming language in the 1980s. Used today by companies like Ericsson, WhatsApp, and Goldman Sachs
- **Intel** - Haskell compiler as part of research on scaled multicore parallelism



Conclusions

Turing machines can be seen as representing computer hardware

- Makes them ideal for measuring resources used during an algorithm
- Ideas/fields developed from Turing machines:
 - Complexity theory
 - P v. NP
 - RAM models
 - Hardness of approximation

Lambda calculus can be seen as representing computer software

- Makes them ideal for analyzing the structure of an algorithm
- Ideas/fields developed from lambda calculus:
 - Type theory
 - Implicit-memory management
 - Polymorphism
 - Proof-checkers

Despite being used for different applications, they both represent the limits of computability

Q&A

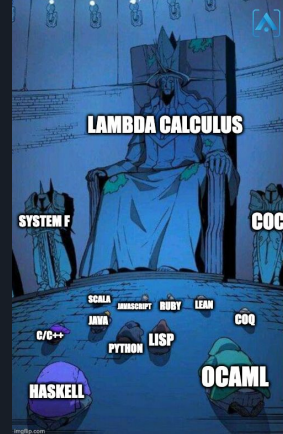
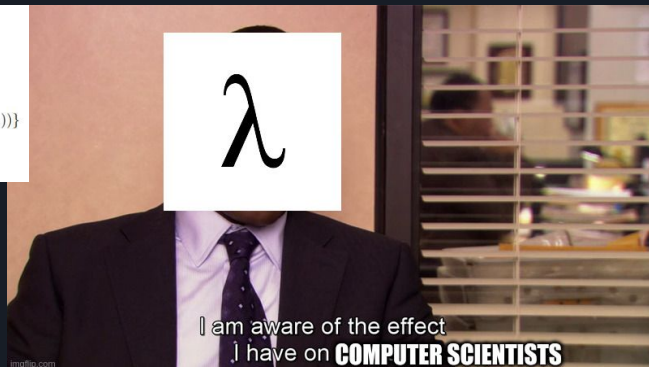
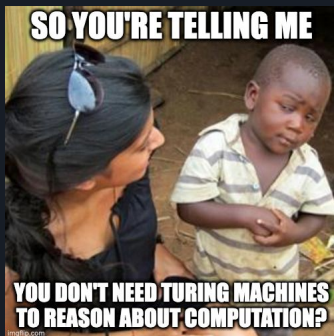
Any Questions?

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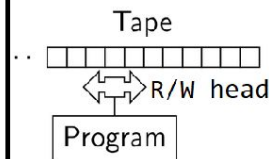
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10 minutes into lambda-calculus and chill...

$$\begin{aligned} \mathbb{N} &\equiv \{0\} \cup \{n \mid n = \text{succ}^n(0)\} \\ &\equiv \{0, \text{succ}(0), \text{succ}(\text{succ}(0)), \dots, \underbrace{\text{succ}(\text{succ}(\dots(\text{succ}(0))\dots))}_{n \text{ fois}}\} \\ &\equiv \{0, 1, 2, \dots, n\} \end{aligned}$$



Syntax	Name
x	Variable
($\lambda x.M$)	Abstraction
(M N)	Application



Lambda Calculus Memes



Subtraction
in every
other
language

Subtraction
in lambda
calculus

