

# Lambda Calculus

COS 441 Slides 12

read: 3.4, 5.1, 5.2, 3.5 Pierce

# the lambda calculus

- Originally, the lambda calculus was developed as a logic by Alonzo Church in 1932 at Princeton
  - Church says: “There may, indeed, be other applications of the system than its use as a logic.”
  - Dave says: “There sure are!”
- The lambda calculus is a language of pure functions
- It serves as the semantic basis for languages like Haskell that are based around functions, but also pretty much every other language that includes some notion of function
- It is just as powerful as a Turing Machine (lambda terms can compute anything a Turing Machine can) and provides an alternate basis for understanding computation
  
- Pierce Text, Chap 3, 5

# Operational Semantics

- **Denotational semantics** for a language provides a function that translates from program syntax into mathematical objects like sets, functions, lists or even some other programming language
  - a denotational semantics acts like a compiler
- **Operational semantics** works by rewriting or executing programs step-by-step
  - it uses only one program syntax to explain how a program runs
- As languages become more complicated, it is often easier to define operational semantics than denotational semantics
  - it requires less math to do so
  - but you might not be able to prove particularly strong theorems using the semantics
- Starting with the lambda calculus, we will look at operational semantics

# Operational Rules

- Operational rules typically look like this:

$$\frac{\text{condition1} \dots \text{conditionk} \quad \text{subprogram} \rightarrow \text{subprogram}'}{\text{prog} \rightarrow \text{prog}'}$$

- Read  $\text{prog} \rightarrow \text{prog}'$  as prog "steps to" prog'
- $\text{prog} \rightarrow \text{prog}'$  is a new kind of judgement (aka property/assertion/claim)

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- $\text{prog} \rightarrow \text{prog}'$  is a new kind of judgement (aka property/assertion/claim)
- An example, defining evaluation of if statements:

$$\frac{e \rightarrow e'}{\text{if } e \text{ then } c1 \text{ else } c2 \rightarrow \text{if } e' \text{ then } c1 \text{ else } c2}$$

---

if True then c1 else c2  $\rightarrow$  c1

---

if False then c1 else c2  $\rightarrow$  c2

# LAMBDA CALCULUS

# syntax

|               |  |
|---------------|--|
| $e ::= x$     | (a variable)   |
| $\lambda x.e$ | (a function; in Haskell: $\lambda x \rightarrow e$ ) |
| $e e$         | (function application)                               |

[ “ $\lambda$ ” will be written “ $\lambda$ ” in a nice font and pronounced "lambda"]

# syntax

- the identity function:
  - $\lambda x.x$
- 2 notational conventions:
  - applications associate to the left (like in Haskell):
  - “ $y z x$ ” is “ $(y z) x$ ”
  - the body of a lambda extends as far as possible to the right:
  - “ $\lambda x.x \lambda z.x z x$ ” is “ $\lambda x.(x \lambda z.(x z x))$ ”



# terminology

$\lambda x.x x$

the **scope** of  $x$  is the entire body of the function  
(ie: the  $x$ 's that appear in the body of the function refer to that particular argument)

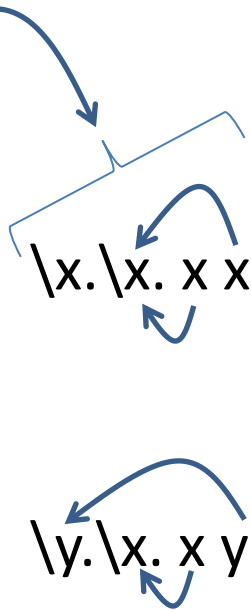
$\lambda x.x y$

$y$  is **free** in the term  $\lambda x.x y$

$x$  is **bound**  
in the term  $\lambda x.x y$

# scope again, shadowed names

the scope of the right-most  $x$  includes the body of the function; the scope of the left-most  $x$  does not



if you wanted to refer to the first  $x$ , above, well you can't. You should have chosen a different variable name in your programs

Important note: The names of bound variables don't matter to the semantics of lambda calculus programs, so you can rename bound variables (provided you do so consistently) whenever you want.

$$\lambda x. x \quad == \quad \lambda y. y \quad == \quad \lambda z. z$$

$$\lambda x. \lambda y. x y \quad == \quad \lambda y. \lambda x. y x \quad == \quad \lambda z. \lambda w. z w$$

# Call-by-value operational semantics

- single-step, **call-by-value** operational semantics:

$$e \rightarrow e'$$

- In English, we say “e steps to e’”
- This is a new kind of “judgement”, just like a Hoare triple was a judgement and there were rules that allowed us to conclude when it was a valid judgement

# Call-by-value operational semantics

- single-step, call-by-value operational semantics:  $e \rightarrow e'$ 
  - values are  $v ::= \lambda x.e$
  - primary rule (beta reduction):

$$\frac{}{(\lambda x.e) v \rightarrow e [v/x]}$$

call-by-value  
since argument is a  
value rather than  
general expression

- $e [v/x]$  is the expression in which all free occurrences of  $x$  in  $e$  are replaced with  $v$
- this replacement operation is called **substitution**
- implementing substitution for the lambda calculus properly is actually tougher than it would seem at first

# operational semantics

- beta rule:

$$\frac{}{(\lambda x.e) v \rightarrow e [v/x]} \text{ (beta)}$$

- is used together with **search rules**:

$$\frac{e1 \rightarrow e1'}{e1 e2 \rightarrow e1' e2} \text{ (app1)}$$

$$\frac{e2 \rightarrow e2'}{v e2 \rightarrow v e2'} \text{ (app2)}$$

- notice, because of the rules, evaluation is left to right
- and that's it -- 3 rules -- that is all you need to know about evaluating expressions in the lambda calculus!

# Example

- Program:

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

- Proof that it can take a step:

$$\frac{}{(\lambda x.e) v \rightarrow e [v/x]} \text{ (beta)}$$

$$\frac{e1 \rightarrow e1'}{e1 e2 \rightarrow e1' e2} \text{ (app1)}$$

$$\frac{e2 \rightarrow e2'}{v e2 \rightarrow v e2'} \text{ (app2)}$$

# Example

- Program:

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

- Proof that it can take a step:

$$\frac{\frac{\lambda x.\lambda y. x y \quad \lambda w.w \quad \lambda z.z}{(\lambda x.\lambda y. x y) (\lambda w.w) (\lambda z.z)} \quad \text{(app1)}}{\frac{\lambda x.\lambda y. x y \quad \lambda w.w \quad \lambda z.z \quad \lambda z.z}{(\lambda x.\lambda y. x y) (\lambda w.w) \rightarrow \lambda y. (\lambda w.w) y \quad \lambda z.z} \quad \text{(beta)}}$$

$\underbrace{\lambda x.\lambda y. x y}_{e1} \quad \underbrace{\lambda w.w}_{e2} \quad \underbrace{\lambda y. (\lambda w.w) y}_{e1'} \quad \underbrace{\lambda z.z}_{e2}$

$$\frac{}{\lambda x.e \ v \rightarrow e \ [v/x]} \quad \text{(beta)}$$
$$\frac{e1 \rightarrow e1'}{e1 \ e2 \rightarrow e1' \ e2} \quad \text{(app1)}$$
$$\frac{e2 \rightarrow e2'}{v \ e2 \rightarrow v \ e2'} \quad \text{(app2)}$$

# Example

- Program:

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

- Proof that it can take a step:

$$\frac{\frac{}{(\lambda x. \lambda y. x y) (\lambda w. w) \rightarrow \lambda y. (\lambda w. w) y} \text{ (beta)}}{((\lambda x. \lambda y. x y) (\lambda w. w)) (\lambda z. z) \rightarrow (\lambda y. (\lambda w. w) y) (\lambda z. z)} \text{ (app1)}$$

- Proof it can take a second step:

$$\frac{}{(\lambda y. (\lambda w. w) y) (\lambda z. z) \rightarrow (\lambda w. w) (\lambda z. z)} \text{ (beta)}$$

- So we typically write (without explicit proofs):

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

$$\frac{}{(\lambda x. e) v \rightarrow e [v/x]} \text{ (beta)}$$
$$\frac{e1 \rightarrow e1'}{e1 e2 \rightarrow e1' e2} \text{ (app1)}$$
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# Example

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

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$\rightarrow x x [\lambda y.y / x]$

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

$\rightarrow y [\lambda y.y / y]$

# Example

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

# A Non-Example

- Given:

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

- One might think that:

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

- Since:  $(\lambda w.w) (\lambda z.z) \rightarrow (\lambda z.z)$

- But that would require the presence of this rule:

$$\frac{e2 \rightarrow e2'}{e1 e2 \rightarrow e1 e2'} \text{ (app3)}$$

$$\frac{}{(\lambda x.e) v \rightarrow e [v/x]} \text{ (beta)}$$
$$\frac{e1 \rightarrow e1'}{e1 e2 \rightarrow e1' e2} \text{ (app1)}$$
$$\frac{e2 \rightarrow e2'}{v e2 \rightarrow v e2'} \text{ (app2)}$$

## Another example

$(\backslash x.x x) (\backslash x.x x)$

## Another example

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

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



## Another example

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

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

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

- In other words, it is simple to write non-terminating computations in the lambda calculus
- So, what else can we do with the lambda calculus?

# We can do everything

- The lambda calculus can be used as an “assembly language”
- We can show how to compile useful, high-level operations and language features into the lambda calculus
  - Result = adding high-level operations is **convenient** for programmers, but **not a computational necessity**
  - Result = make your compiler intermediate language simpler
- Translations that show how to implement various useful programming features in the lambda calculus are typically called "Church encodings" after Alonzo Church

# Aside

- Single-step reduction, one by one, gets pretty tedious, so we can make up a new notation for multi-step evaluation (and give the new notation a formal definition!)
- To say a program takes 0, 1 or many steps, we write:

$$e \twoheadrightarrow^* e'$$

- Rules:

$$\frac{}{e \twoheadrightarrow^* e} \text{ (reflexivity)}$$

$$\frac{e1 \twoheadrightarrow e2 \quad e2 \twoheadrightarrow^* e3}{e1 \twoheadrightarrow^* e3} \text{ (transitivity)}$$

# Aside

$$\frac{}{e \dashrightarrow^* e} \text{ (reflexivity)}$$

$$\frac{e1 \dashrightarrow e2 \quad e2 \dashrightarrow^* e3}{e1 \dashrightarrow^* e3} \text{ (transitivity)}$$

- A multi-step proof:

$$\frac{a \dashrightarrow b \quad b \dashrightarrow^* e}{a \dashrightarrow^* e}$$

# Aside

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- A multi-step proof:

$$\frac{a \dashrightarrow b \quad \frac{b \dashrightarrow c \quad c \dashrightarrow^* e}{b \dashrightarrow^* e}}{a \dashrightarrow^* e}$$

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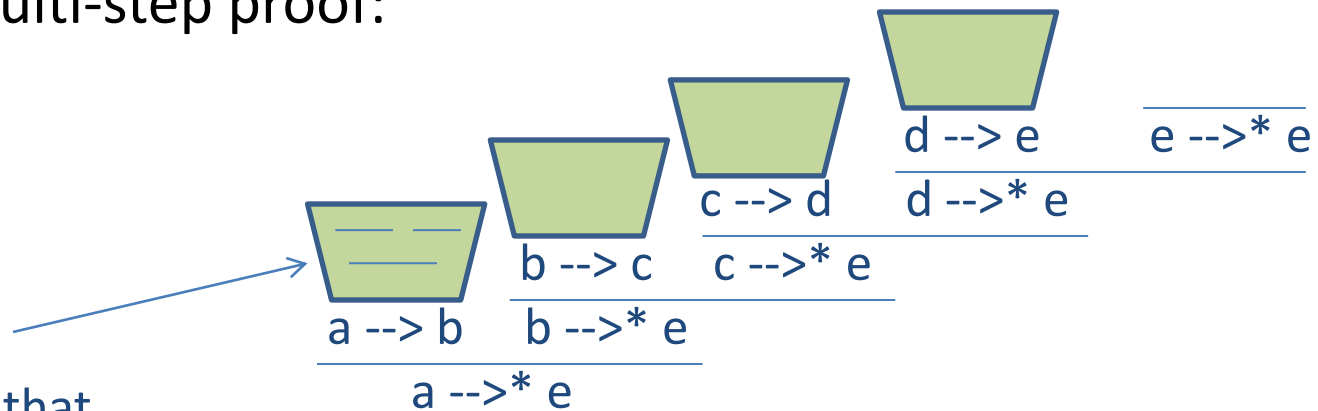
$$\frac{a \dashrightarrow b \quad \frac{b \dashrightarrow c \quad \frac{c \dashrightarrow d \quad \frac{d \dashrightarrow e \quad \overline{e \dashrightarrow^* e}}{d \dashrightarrow^* e}}{c \dashrightarrow^* e}}{b \dashrightarrow^* e}}{a \dashrightarrow^* e}$$

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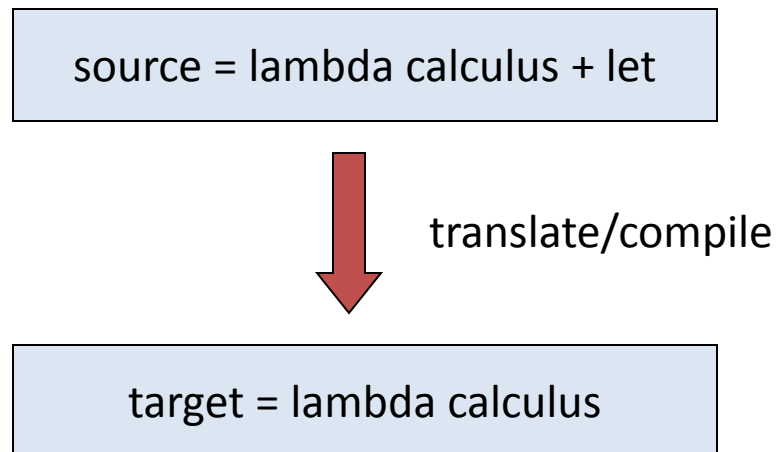


# **CHURCH ENCODINGS**



# Let Expressions

- It is useful to bind intermediate results of computations to variables:  
let  $x = e_1$  in  $e_2$
- Question: can we implement this idea in the lambda calculus?



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translate (let  $x = e_1$  in  $e_2$ ) =

$(\lambda x. \text{translate } e_2) (\text{translate } e_1)$

translate  $(x) = x$

translate  $(\lambda x.e) = \lambda x.\text{translate } e$

translate  $(e_1 e_2) = (\text{translate } e_1) (\text{translate } e_2)$

# **ENCODING BOOLEANS**

# booleans

- we can encode booleans
  - we will represent “true” and “false” as functions named “tru” and “fls”
  - how do we define these functions?
  - think about how “true” and “false” can be used
  - they can be used by a testing function:
    - “test b then else” returns “then” if b is true and returns “else” if b is false
    - the only thing the implementation of test is going to be able to do with b is to apply it
    - the functions “tru” and “fls” must distinguish themselves when they are applied

# booleans

- the encoding:

`tru = \t.\f. t`

`fls = \t.\f. f`

`test = \x.\then.\else. x then else`

# booleans

tru = \t.\f. t      fls = \t.\f. f

test = \x.\then.\else. x then else

eg:

test tru a b



# booleans

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eg:

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== (\x.\then.\else. x then else) (\t.\f.t) a b

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-->\* (\t.\f. t) a b

# booleans

tru = \t.\f. t      fls = \t.\f. f

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eg:

test tru a b

== (\x.\then.\else. x then else) (\t.\f.t) a b

-->\* (\t.\f. t) a b

-->\* a

# Challenge

$\text{tru} = \lambda t.\lambda f. t$        $\text{fls} = \lambda t.\lambda f. f$

$\text{test} = \lambda x.\lambda \text{then}.\lambda \text{else}. x \text{ then else}$

create a function "and" in the lambda calculus that mimics conjunction. It should have the following properties.

$\text{and tru tru} \rightarrow^* \text{tru}$

$\text{and fls tru} \rightarrow^* \text{fls}$

$\text{and tru fls} \rightarrow^* \text{fls}$

$\text{and fls fls} \rightarrow^* \text{fls}$

# **SUMMARY**

# Summary

- The Lambda Calculus involves just 3 things:
  - variables  $x, y, z$
  - function definitions  $\lambda x.e$
  - function application  $e_1 e_2$
- Despite its simplicity, despite the apparent lack of if statements or loops or any data structures other than functions, it is Turing complete
- Church encodings are translations that show how to encode various data types or linguistic features in the lambda calculus