

# EECS 490 – Lecture 12

## Lambda Calculus II

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# Announcements

- ▶ HW3 due Fri 10/20
- ▶ Project 3 due Fri 10/27

# Review: $\lambda$ -Calculus

- Context-free grammar:

*Expression*  $\rightarrow$  *Variable*

|  $\lambda$  *Variable* . *Expression*

**(function abstraction)**

| *Expression* *Expression*

**(function application)**

| ( *Expression* )

- Variables denoted by single letters

- Examples:

$\lambda x. x$

(identity function)

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

(identity function applied to variable  $y$ )

# Review: $\alpha$ -Reduction

- In  $(\lambda x. E)$ , replacing all occurrences of  $x$  with  $y$  does not change the meaning as long as  $y$  does not appear in  $E$

$$\underline{\lambda x. x x} =_{\alpha} \underline{\lambda y. y y}$$

- This renaming is called  $\alpha$ -reduction
- Two expressions are  *$\alpha$ -equivalent* if they only differ by  $\alpha$ -reductions

# Review: $\beta$ -Reduction

$\beta$ -equivalent  
to identity  
function

- In function application, we apply  $\alpha$ -reduction to ensure that the function and its argument have distinct names
  - Accomplishes the same thing as frames and environments

$$\underline{(\lambda x. x) (\lambda x. x)} \rightarrow_{\alpha} (\lambda x. x) (\lambda y. y)$$

- We then substitute the argument expression for the parameter in the scope of the parameter
  - This is  $\beta$ -reduction and is equivalent to a call-by-name parameter-passing strategy

$$\rightarrow (\lambda x. x) (\lambda y. y) \rightarrow_{\beta} \underline{\lambda y. y}$$

- Two expressions are  $\beta$ -equivalent if they  $\beta$ -reduce to the same thing

# Encoding Data

- ▶ Lambda calculus consists only of variables and functions
  - ▶ We can apply  $\beta$ -reduction to substitute functions for variables
- ▶ None of the familiar values, such as integers or booleans, exist directly in  $\lambda$ -calculus
- ▶ However, we can encode values as functions

# Booleans

- True and false are represented as functions that take in a true and a false value and return the appropriate value

$\text{true} = \lambda t. \lambda f. t$   
 $\text{false} = \lambda t. \lambda f. f$

Picks the first value

Picks the second value

Mathematical definition,  
not assignment

$\text{factorial} = \dots \text{factorial} \dots$

- Logical operators are defined as follows:

$\text{and} = \lambda a. \lambda b. a \ b \ a$   
 $\text{or} = \lambda a. \lambda b. a \ a \ b$   
 $\text{not} = \lambda b. b \ \text{false} \ \text{true}$

# Conjunction

$\text{true} = \lambda t. \lambda f. t$   
 $\text{false} = \lambda t. \lambda f. f$   
 $\text{and} = \lambda a. \lambda b. a \ b \ a$

Applying *and* to *true* and another boolean results in:

$\text{and true bool} = ((\lambda a. \lambda b. a \ b \ a) \ \text{true}) \ \text{bool}$   
 $\rightarrow (\lambda b. \text{true } b \ \text{true}) \ \text{bool}$   
 $\rightarrow (\lambda b. b) \ \text{bool}$   
 $\rightarrow \text{bool}$

Applying *and* to *false* and another boolean results in:

$\text{and false bool} = ((\lambda a. \lambda b. a \ b \ a) \ \text{false}) \ \text{bool}$   
 $\rightarrow (\lambda b. \text{false } b \ \text{false}) \ \text{bool}$   
 $\rightarrow (\lambda b. \text{false}) \ \text{bool}$   
 $\rightarrow \text{false}$

expr<sub>1</sub>, expr<sub>2</sub>



# Disjunction

```

true = λt. λf. t
false = λt. λf. f
or = λa. λb. a a b

```

- Applying *or* to *true* and another boolean results in:

```

or true bool = ((λa. λb. a a b) true) bool
                  → (λb. true true bool) bool
                  → (λb. true) bool
                  → true

```

- Applying *or* to *false* and another boolean results in:

```

or false bool = ((λa. λb. a a b) false) bool
                  → (λb. false false b) bool
                  → (λb. b) bool
                  → bool

```

# Negation

```
true = λt. λf. t  
false = λt. λf. f  
not = λb. b false true
```

- Applying *not* to a boolean results in:

```
not true = (λb. b false true) true  
          → true false true  
          → false
```

```
not false = (λb. b false true) false  
            → false false true  
            → true
```

# Conditional

$$\text{true} = \lambda t. \lambda f. t$$

$$\text{false} = \lambda t. \lambda f. f$$

- A conditional takes in a boolean, a "then" value, and an "else" value

$\text{if} = \lambda p. \lambda a. \lambda b. p \ a \ b$

*(Handwritten red annotations: a red arrow points to the parameter 'p', and red horizontal lines are drawn under 'a' and 'b'.)*

- Applying *if* to *true* and *false* results in:

$\text{if true } x \ y = (\lambda p. \lambda a. \lambda b. p \ a \ b) \ \text{true } x \ y$   
 $\rightarrow (\lambda a. \lambda b. \text{true } a \ b) \ x \ y$   
 $\rightarrow (\lambda a. \lambda b. a) \ x \ y$   
 $\rightarrow x$

$\text{if false } x \ y = (\lambda p. \lambda a. \lambda b. p \ a \ b) \ \text{false } x \ y$   
 $\rightarrow (\lambda a. \lambda b. \text{false } a \ b) \ x \ y$   
 $\rightarrow (\lambda a. \lambda b. b) \ x \ y$   
 $\rightarrow y$

*(Handwritten red annotations: a red arrow points from 'false' to the lambda expression, and a red circle is drawn around 'b' in the third line.)*

*(Handwritten red annotations: a red circle is drawn around the entire expression  $(\lambda b. b) \ y$ , and a red 'y' is written below it.)*

# Pairs

$\text{pair } a (\text{pair } b (\text{pair } c \text{ nil}))$

- A pair is represented as a higher-order function that takes in two items and a function, then applies its function argument to the two items

$\text{pair} = \lambda x. \lambda y. \lambda f. f \ x \ y$   
 $\text{pair } a \ b = (\lambda x. \lambda y. \lambda f. f \ x \ y) \ a \ b$   
 $\rightarrow \lambda f. f \ a \ b$

- We can define selectors:

$\text{first} = \lambda p. p \ \text{true}$   
 $\text{second} = \lambda p. p \ \text{false}$

$(\lambda f. f \ a \ b) (\text{true})$   
 $\rightarrow \text{true } a \ b \rightarrow a$

- We can define nil and a null predicate:

$\text{nil} = \lambda x. \text{true}$   
 $\text{null} = \lambda p. p \ (\lambda x. \lambda y. \text{false})$

$\text{first } (\text{pair } a \ b)$   
 $(\text{pair } a \ b) \ \text{true}$

# Selectors

```
pair a b → λf. f a b  
first = λp. p true  
second = λp. p false
```

- Selectors work as follows:

```
first (pair a b) = (λp. p true) (pair a b)  
→ (pair a b) true  
= (λf. f a b) true  
→ true a b  
→ a
```

```
second (pair a b) = (λp. p false) (pair a b)  
→ (pair a b) false  
= (λf. f a b) false  
→ false a b  
→ b
```

# Null Predicate

```
pair a b → λf. f a b  
nil = λx. true  
null = λp. p (λx. λy. false)
```

- The null predicate works as follows:

```
null nil = (λp. p (λx. λy. false)) λx. true  
          → (λx. true) (λx. λy. false)  
          → true
```

```
null (pair a b) = (λp. p (λx. λy. false)) (pair a b)  
                → (pair a b) (λx. λy. false)  
                = (λf. f a b) (λx. λy. false)  
                → (λx. λy. false) a b  
                → (λy. false) b  
                → false
```

# Trees

- Now that we have pairs, we can represent arbitrary data structures, including trees:

```
tree = λd. λl. λr. pair d (pair l r)
datum = λt. first t
left = λt. first (second t)
right = λt. second (second t)
empty = nil
isempty = null
```

tree datum left right  
pair datum (pair left right)

- ▶ We'll start again in five minutes.



# Church Numerals

- A natural number  $n$  is represented as a function that takes in another function  $f$  and an item  $x$  and applies  $f$  to the item a total of  $n$  times:

zero =  $\lambda f. \lambda x. x$

one =  $\lambda f. \lambda x. f\ x$

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

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

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

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

...

~~$\lambda x. f^0\ x$~~

- Mathematically speaking, a number  $n$  takes  $f$  and produces the self-composition  $f^n$

$$\text{three } f \rightarrow f^3 = f \circ f \circ f$$

# Increment

$$\begin{aligned} \text{zero} &= \lambda f. \lambda x. x \\ \text{one} &= \lambda f. \lambda x. f \ x \\ \text{two} &= \lambda f. \lambda x. f \ (f \ x) \end{aligned}$$

► We can increment a number as follows:

$\rightarrow \text{incr} = \lambda n. \lambda f. \lambda y. f \ (n \ f \ y)$ 

 $n \ f \rightarrow f^n$   
 $f(n \ f \ y) = f^{n+1} y$

$$\begin{aligned} \text{incr zero} &= (\lambda n. \lambda f. \lambda y. f \ (n \ f \ y)) \ \text{zero} \\ &\rightarrow \lambda f. \lambda y. f \ (\text{zero} \ f \ y) \\ &= \lambda f. \lambda y. f \ ((\lambda x. x) \ y) \\ &\rightarrow \lambda f. \lambda y. f \ y \\ &= \text{one} \end{aligned}$$

$$\begin{aligned} \text{incr one} &= (\lambda n. \lambda f. \lambda y. f \ (n \ f \ y)) \ \text{one} \\ &\rightarrow \lambda f. \lambda y. f \ (\text{one} \ f \ y) \\ &= \lambda f. \lambda y. f \ ((\lambda x. f \ x) \ y) \\ &\rightarrow \lambda f. \lambda y. f \ (f \ y) \\ &= \text{two} \end{aligned}$$

plus  $m \ n \rightarrow \text{incr}^m \ n$   
 (m incr) n

We depart from normal-order evaluation to simplify reasoning about the results.

```
two = λf. λx. f (f x)
incr = λn. λf. λy. f (n y)
```

# Addition and Multiplication

- We can define addition as follows:

```
plus = λm. λn. m incr n
```

Apply the *incr* function  
*m* times to *n*

```
plus two three = (λm. λn. m incr n) two three
                → (λn. two incr n) three
                = (λn. (λf. λx. f (f x)) incr n) three
                → (λn. (λx. incr (incr x)) n) three
                → (λx. incr (incr x)) three
                → incr (incr three)
                → incr four
                → five
```

- We can similarly define multiplication:

```
times = λm. λn. m (plus n)
```

Apply the *(plus n)*  
function *m* times  
to 0

zero

We can define exponentiation using the same strategy.

10/16/17

# Zero Predicate

```
zero = λf. λx. x
one  = λf. λx. f x
two  = λf. λx. f (f x)
```

- Predicate to check for zero:

```
iszero = λn. n (λy. false) true
```

Only results in true if function never applied

```
iszero zero = (λn. n (λy. false) true) zero
→ zero (λy. false) true
= (λf. λx. x) (λy. false) true
→ (λx. x) true
→ true
```

```
iszero one = (λn. n (λy. false) true) one
→ one (λy. false) true
= (λf. λx. f x) (λy. false) true
→ (λx. (λy. false) x) true
→ (λx. false) true
→ false
```

# Recursion

- Functions are anonymous, so need to arrange to pass in function as an argument to itself

```
fact = λf. λn. if (iszero n)
  one
  (times n (f f (decr n)))
```

Decrement  
function

Pass along function to  
itself in recursive call

- We also need an auxiliary apply function

```
apply = λg. g g
```

*apply fact → fact fact*

# Example

- Computing factorial:

```

apply fact m = (λg. g g) fact m
→ fact fact m
= (λf. λn. if (iszero n) one
              (times n (f f (decr n))))
  fact m
→ (λn. if (iszero n) one
          (times n (fact fact
                      (decr n))))
  m
→ if (iszero m) one
    (times m (fact fact (decr m)))
=β if (iszero m) one
    (times m (apply fact (decr m)))
  
```

# Y Combinator

- Also known as a *fixed-point combinator*

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

- Applying  $Y$  to a function  $F$  results in

$$\begin{aligned}
 Y F &= (\lambda f. (\lambda x. f (x x)) (\lambda x. f (x x))) F \\
 &\rightarrow (\lambda x. F (x x)) (\lambda x. F (x x)) \\
 &\rightarrow (\lambda x. F (x x)) (\lambda y. F (y y)) \\
 &\rightarrow F ((\lambda y. F (y y)) (\lambda y. F (y y))) \\
 &= F (Y F)
 \end{aligned}$$

# Simpler Factorial

No longer have  
to pass function  
to itself

- First, define the concrete function  $F$ :

$F = \lambda f. \lambda n. \text{if } (\text{iszero } n) \text{ one } (\text{times } n \text{ (f (decr } n)))$

- Now apply  $Y$  to  $F$ , and apply result to a number:

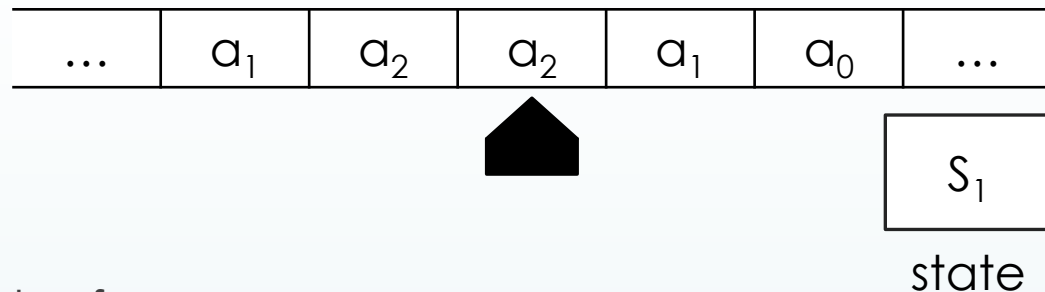
$$\begin{aligned} Y \ F \ m &\rightarrow F \ (Y \ F) \ m \\ &= (\lambda f. \lambda n. \text{if } (\text{iszero } n) \text{ one } (\text{times } n \text{ (f (decr } n)))) \\ &\quad (Y \ F) \ m \\ &\rightarrow (\lambda n. \text{if } (\text{iszero } n) \text{ one } (\text{times } n \text{ (Y } F \text{ (decr } n)))) \ m \\ &\rightarrow \text{if } (\text{iszero } m) \text{ one } (\text{times } m \text{ (Y } F \text{ (decr } m))) \end{aligned}$$

- Letting  $\text{fact} = Y \ F$ , we get

$\text{fact } m \rightarrow \text{if } (\text{iszero } m) \text{ one } (\text{times } m \text{ (fact (decr } m)))$



# Turing Machine



- Consists of:
  - An infinite *tape* divided into cells, each containing a symbol from a finite alphabet
  - A *head* positioned at a cell and that can move left or right
  - A *state register* that keeps track of the state of the machine, one of finitely many
  - A *table* of instructions that specifies what to do given a state and the symbol currently under the head
    - Write a specific symbol to the current cell
    - Move the head one step to the left or right
    - Go to a new state

# Church-Turing Thesis

- Alan Turing proved that Turing machines solve the same set of problems as  $\lambda$ -calculus
- The Church-Turing thesis states that all problems that can be solved by a human using an algorithm can also be solved on a Turing machine
- All known computational models are weaker than or equivalent to Turing machines
  - Equivalent models are *Turing complete*
- A programming language defines a computational model
  - All general-purpose programming languages are Turing complete