

# CMSC 330: Organization of Programming Languages

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## Lambda Calculus

# *Entscheidungsproblem* “decision problem”

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*Is there an algorithm to determine if a statement is true in all models of a theory?*

# *Entscheidungsproblem* “decision problem”

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## Algorithm, formalised



**Alonzo Church:** Lambda calculus

An unsolvable problem of elementary number theory, *Bulletin the American Mathematical Society*, May 1935



**Kurt Gödel:** Recursive functions

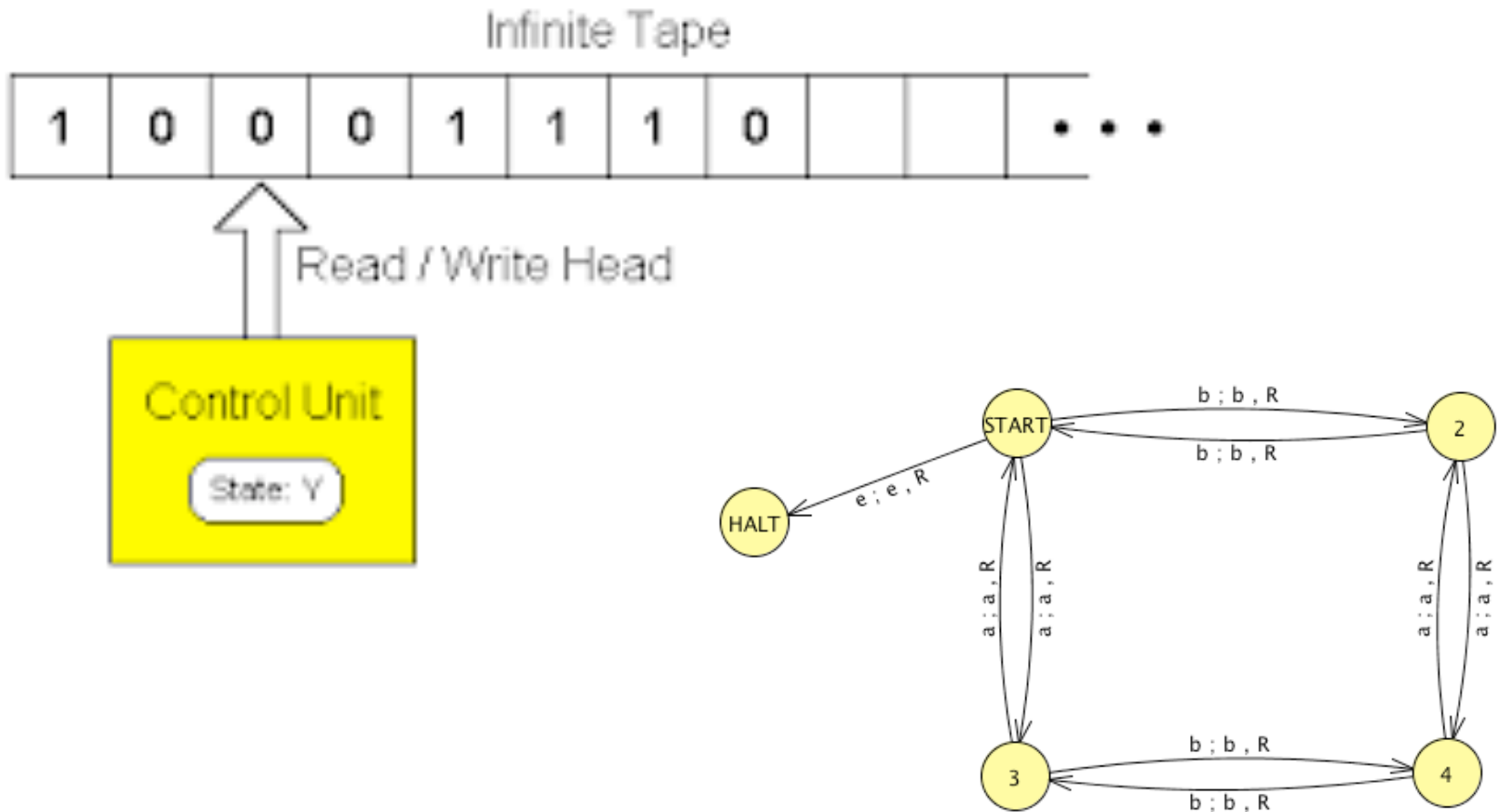
Stephen Kleene, General recursive functions of natural numbers, *Bulletin the American Mathematical Society*, July 1935



**Alan M. Turing:** Turing machines

On computable numbers, with an application to the *Entscheidungsproblem*, *Proceedings of the London Mathematical Society*, received 25 May 1936

# Turing Machine



# Turing Completeness

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- ▶ Turing machines are the most powerful description of computation possible
  - They define the Turing-computable functions
- ▶ A programming language is **Turing complete** if
  - It can map every Turing machine to a program
  - A program can be written to emulate a Turing machine
  - It is a superset of a known Turing-complete language
- ▶ Most powerful programming language possible
  - Since Turing machine is most powerful automaton

# Programming Language Expressiveness

- ▶ So what language features are needed to express all computable functions?
  - What's a minimal language that is Turing Complete?
- ▶ Observe: some features exist just for convenience
  - Multi-argument functions      `foo ( a, b, c )`
    - Use currying or tuples
  - Loops      `while (a < b) ...`
    - Use recursion
  - Side effects      `a := 1`
    - Use functional programming pass “heap” as an argument to each function, return it when with function's result

# Mini C

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You only have:

- If statement
- Plus 1
- Minus 1
- functions

Sum  $n = 1+2+3+4+5\dots n$  in Mini C

```
int add1(int n){return n+1;}
int sub1(int n){return n-1;}
int add(int a,int b){
    if(b == 0) return a;
    else return add( add1(a),sub1(b));
}
int sum(int n){
    if(n == 1) return 1;
    else return add(n, sum(sub1(n)));
}
int main(){
    printf("%d\n",sum(5));
}
```

# Lambda Calculus ( $\lambda$ -calculus)

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- ▶ Proposed in 1930s by
  - Alonzo Church  
(born in Washington DC!)
- ▶ Formal system
  - Designed to investigate functions & recursion
  - For exploration of foundations of mathematics
- ▶ Now used as
  - Tool for investigating computability
  - Basis of functional programming languages
    - Lisp, Scheme, ML, OCaml, Haskell...





# Lambda Calculus Syntax

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- ▶ A lambda calculus **expression** is defined as

$e ::= x$

**variable**

|  $\lambda x.e$

**abstraction** (fun def)

|  $e e$

**application** (fun call)

- ▶ This grammar describes ASTs; not for parsing (ambiguous!)
- ▶ Lambda expressions also known as lambda **terms**
- $\lambda x.e$  is like `(fun x -> e)` in OCaml

That's it! Nothing but higher-order functions

# Why Study Lambda Calculus?

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- ▶ It is a “core” language
  - Very small but still Turing complete
- ▶ But with it can explore general ideas
  - Language features, semantics, proof systems, algorithms, ...
- ▶ Plus, higher-order, anonymous functions (aka *lambdas*) are now very popular!
  - C++ (C++11), PHP (PHP 5.3.0), C# (C# v2.0), Delphi (since 2009), Objective C, Java 8, Swift, Python, Ruby (Procs), ... (and functional languages like OCaml, Haskell, F#, ...)

# Three Conventions

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- ▶ Scope of  $\lambda$  extends as far right as possible
  - Subject to scope delimited by parentheses
  - $\lambda x. \lambda y. x y$  is same as  $\lambda x. (\lambda y. (x y))$
- ▶ Function application is left-associative
  - $x y z$  is  $(x y) z$
  - Same rule as OCaml
- ▶ As a convenience, we use the following “syntactic sugar” for local declarations
  - $\text{let } x = e1 \text{ in } e2$  is short for  $(\lambda x. e2) e1$

# OCaml Lambda Calc Interpreter

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```
type id = string
type exp = Var of id
         | Lam of id * exp
         | App of exp * exp

y          Var "y"
λx.x       Lam ("x", Var "x")
λx.λy.x y  Lam ("x", (Lam ("y", App (Var "x", Var "y"))))
(λx.λy.x y) λx.x x  App
                    (Lam ("x", Lam ("y", App (Var "x", Var "y"))),
                     Lam ("x", App (Var "x", Var "x")))
```

# Quiz #1

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$\lambda x. (y\ z)$  and  $\lambda x. y\ z$  are equivalent

- A. True
- B. False

# Quiz #1

---

$\lambda x. (y\ z)$  and  $\lambda x. y\ z$  are equivalent

**A. True**

**B. False**

## Quiz #2

---

What is this term's AST?

$\lambda x. x \ x$

```
type id = string
type exp =
    Var of id
  | Lam of id * exp
  | App of exp * exp
```

- A. App (Lam ("x", Var "x"), Var "x")
- B. Lam (Var "x", Var "x", Var "x")
- C. Lam ("x", App (Var "x", Var "x"))
- D. App (Lam ("x", App ("x", "x")))

## Quiz #2

---

What is this term's AST?

$\lambda x. x \ x$

```
type id = string
type exp =
    Var of id
  | Lam of id * exp
  | App of exp * exp
```

- A. App (Lam ("x", Var "x"), Var "x")
- B. Lam (Var "x", Var "x", Var "x")
- C. Lam ("x", App (Var "x", Var "x"))
- D. App (Lam ("x", App ("x", "x")))



## Quiz #3

---

This term is equivalent to which of the following?

$\lambda x. x \ a \ b$

A.  $(\lambda x. x) \ (a \ b)$

B.  $((\lambda x. x) \ a) \ b)$

C.  $\lambda x. (x \ (a \ b))$

D.  $(\lambda x. ((x \ a) \ b))$

## Quiz #3

---

This term is equivalent to which of the following?

$\lambda x. x \ a \ b$

A.  $(\lambda x. x) \ (a \ b)$

B.  $((\lambda x. x) \ a) \ b$

C.  $\lambda x. (x \ (a \ b))$

D.  $(\lambda x. ((x \ a) \ b))$

# Lambda Calculus Semantics

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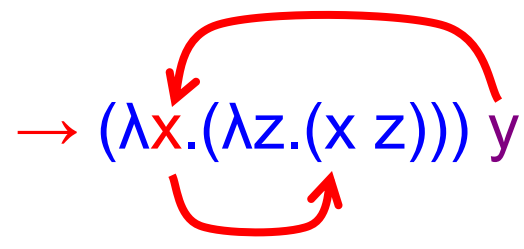
- ▶ Evaluation: All that's involved are function calls  $(\lambda x.e1) e2$ 
  - Evaluate  $e1$  with  $x$  replaced by  $e2$
- ▶ This application is called **beta-reduction**
  - $(\lambda x.e1) e2 \rightarrow e1[x:=e2]$ 
    - $e1[x:=e2]$  is  $e1$  with occurrences of  $x$  replaced by  $e2$
    - This operation is called *substitution*
      - **Replace** formals with actuals
      - Instead of using environment to map formals to actuals
  - We allow reductions to occur *anywhere* in a term
    - Order reductions are applied does not affect final value!
- ▶ When a term **cannot be reduced further** it is in **beta normal form**

# Beta Reduction Example

►  $(\lambda x. \lambda z. x z) y$

$\rightarrow (\lambda x. (\lambda z. (x z))) y$  // since  $\lambda$  extends to right

$\rightarrow (\lambda x. (\lambda z. (x z))) y$  // apply  $(\lambda x. e1) e2 \rightarrow e1[x:=e2]$   
// where  $e1 = \lambda z. (x z)$ ,  $e2 = y$



$\rightarrow \lambda z. (y z)$  // final result

Parameters

- Formal
- Actual

► Equivalent OCaml code

•  $(\text{fun } x \rightarrow (\text{fun } z \rightarrow (x z))) y \rightarrow \text{fun } z \rightarrow (y z)$

# Beta Reduction Examples

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►  $(\lambda x.x) z \rightarrow z$

►  $(\lambda x.y) z \rightarrow y$

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

- A function that applies its argument to  $y$

# Beta Reduction Examples (cont.)

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- ▶  $(\lambda x.x\ y)\ (\lambda z.z) \rightarrow (\lambda z.z)\ y \rightarrow y$
- ▶  $(\lambda x.\lambda y.x\ y)\ z \rightarrow \lambda y.z\ y$ 
  - A curried function of two arguments
  - Applies its first argument to its second
- ▶  $(\lambda x.\lambda y.x\ y)\ (\lambda z.zz)\ x \rightarrow (\lambda y.(\lambda z.zz)y)x \rightarrow (\lambda z.zz)x \rightarrow xx$

# Beta Reduction Examples (cont.)

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

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

# Beta Reduction Examples (cont.)

---

$$(\lambda \mathbf{x}.x \ (\lambda y.y)) \ (\mathbf{u} \ \mathbf{r}) \rightarrow (\mathbf{u} \ \mathbf{r}) \ (\lambda y.y)$$

$$(\lambda \mathbf{x}.(\lambda w. \ x \ w)) \ (\mathbf{y} \ \mathbf{z}) \rightarrow (\lambda w. \ (\mathbf{y} \ \mathbf{z}) \ w)$$



## Quiz #4

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$(\lambda x. y) z$  can be beta-reduced to

A.  $y$

B.  $y z$

C.  $z$

D. cannot be reduced

## Quiz #4

---

$(\lambda x. y) z$  can be beta-reduced to

A.  $y$

B.  $y z$

C.  $z$

D. cannot be reduced

## Quiz #5

---

Which of the following reduces to  $\lambda z. z$ ?

- a)  $(\lambda y. \lambda z. x) z$
- b)  $(\lambda z. \lambda x. z) y$
- c)  $(\lambda y. y) (\lambda x. \lambda z. z) w$
- d)  $(\lambda y. \lambda x. z) z (\lambda z. z)$

## Quiz #5

---

Which of the following reduces to  $\lambda z. z$ ?

- a)  $(\lambda y. \lambda z. x) z$
- b)  $(\lambda z. \lambda x. z) y$
- c)  $(\lambda y. y) (\lambda x. \lambda z. z) w$**
- d)  $(\lambda y. \lambda x. z) z (\lambda z. z)$

# Static Scoping & Alpha Conversion

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- ▶ Lambda calculus uses **static scoping**
- ▶ Consider the following
  - $(\lambda x.x (\lambda x.x)) z \rightarrow ?$ 
    - The rightmost “x” refers to the second binding
  - This is a function that
    - Takes its argument and applies it to the identity function
- ▶ This function is “the same” as  $(\lambda x.x (\lambda y.y))$ 
  - Renaming bound variables consistently preserves meaning
    - This is called **alpha-renaming** or **alpha conversion**
  - Ex.  $\lambda x.x = \lambda y.y = \lambda z.z$      $\lambda y.\lambda x.y = \lambda z.\lambda x.z$

## Quiz #6

---

Which of the following expressions is **alpha equivalent** to (alpha-converts from)

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

a)  $\lambda y. y y$

b)  $\lambda z. y z$

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

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

## Quiz #6

---

Which of the following expressions is **alpha equivalent** to (alpha-converts from)

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

a)  $\lambda y. y y$

b)  $\lambda z. y z$

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

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

# Defining Substitution

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## ► Use recursion on structure of terms

- $x[x:=e] = e$       // Replace  $x$  by  $e$
- $y[x:=e] = y$       //  $y$  is different than  $x$ , so no effect
- $(e1\ e2)[x:=e] = (e1[x:=e])\ (e2[x:=e])$   
    // Substitute both parts of application
- $(\lambda x.e')[x:=e] = \lambda x.e'$ 
  - In  $\lambda x.e'$ , the  $x$  is a parameter, and thus a local variable that is different from other  $x$ 's. Implements static scoping.
  - So the substitution has no effect in this case, since the  $x$  being substituted for is different from the parameter  $x$  that is in  $e'$
- $(\lambda y.e')[x:=e] = ?$ 
  - The parameter  $y$  does not share the same name as  $x$ , the variable being substituted for
  - Is  $\lambda y.(e'[x:=e])$  correct? No...



# Variable capture

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## ► How about the following?

- $(\lambda x. \lambda y. x y) y \rightarrow ?$
- When we replace  $y$  inside, we don't want it to be **captured** by the inner binding of  $y$ , as this violates static scoping
- I.e.,  $(\lambda x. \lambda y. x y) y \neq \lambda y. y y$

## ► Solution

- $(\lambda x. \lambda y. x y)$  is “the same” as  $(\lambda x. \lambda z. x z)$ 
  - Due to alpha conversion
- So alpha-convert  $(\lambda x. \lambda y. x y) y$  to  $(\lambda x. \lambda z. x z) y$  first
  - Now  $(\lambda x. \lambda z. x z) y \rightarrow \lambda z. y z$

# Completing the Definition of Substitution

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- ▶ Recall: we need to define  $(\lambda y.e')[x:=e]$ 
  - We want to avoid capturing (free) occurrences of  $y$  in  $e$
  - Solution: alpha-conversion!
    - Change  $y$  to a variable  $w$  that does not appear in  $e'$  or  $e$   
(Such a  $w$  is called **fresh**)
    - Replace all occurrences of  $y$  in  $e'$  by  $w$ .
    - Then replace all occurrences of  $x$  in  $e'$  by  $e$ !
- ▶ Formally:
$$(\lambda y.e')[x:=e] = \lambda w.((e' [y:=w]) [x:=e]) \text{ (} w \text{ is fresh)}$$

# Beta-Reduction, Again

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- ▶ Whenever we do a step of beta reduction
  - $(\lambda x.e1) e2 \rightarrow e1[x:=e2]$
  - We must alpha-convert variables as necessary
  - Sometimes performed implicitly (w/o showing conversion)
- ▶ Examples
  - $(\lambda x.\lambda y.x\ y) y = (\lambda x.\lambda z.x\ z) y \rightarrow \lambda z.y\ z \quad //\ y \rightarrow z$
  - $(\lambda x.x\ (\lambda x.x)) z = (\lambda y.y\ (\lambda x.x)) z \rightarrow z\ (\lambda x.x) \quad //\ x \rightarrow y$

# OCaml Implementation: Substitution

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```
(* substitute e for y in m-- m[y:=e] *)
let rec subst m y e =
  match m with
  | Var x ->
    if y = x then e (* substitute *)
    else m          (* don't subst *)
  | App (e1,e2) ->
    App (subst e1 y e, subst e2 y e)
  | Lam (x,e0) -> ...
```

# OCaml Impl: Substitution (cont'd)

---

```
(* substitute e for y in m-- m[y:=e] *)  
let rec subst m y e = match m with ...  
  | Lam (x,e0) ->  
    if y = x then m                               Shadowing blocks  
    else if not (List.mem x (fvs e)) then          substitution  
      Lam (x, subst e0 y e)                        Safe: no capture possible  
    else      Might capture; need to  $\alpha$ -convert  
      let z = newvar() in (* fresh *)  
      let e0' = subst e0 x (Var z) in  
      Lam (z,subst e0' y e)
```

# OCaml Impl: Reduction

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```
let rec reduce e =
```

```
  match e with
```

Straight  $\beta$  rule

```
    App (Lam (x,e), e2) -> subst e x e2
```

```
  | App (e1,e2) ->
```

```
    let e1' = reduce e1 in
```

Reduce lhs of app

```
    if e1' != e1 then App(e1',e2)
```

```
    else App (e1,reduce e2)
```

Reduce rhs of app

```
  | Lam (x,e) -> Lam (x, reduce e)
```

```
  | _ -> e
```

Reduce function body

nothing to do

# Quiz #7

---

Beta-reducing the following term produces what result?

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

- A.  $y \ (\lambda z.z \ y)$
- B.  $z \ (\lambda y.y \ z)$
- C.  $y \ (\lambda y.y \ y)$
- D.  $y \ y$

# Quiz #7

---

Beta-reducing the following term produces what result?

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

- A.  $y \ (\lambda z.z \ y)$
- B.  $z \ (\lambda y.y \ z)$
- C.  $y \ (\lambda y.y \ y)$
- D.  $y \ y$



## Quiz #8

---

Beta reducing the following term produces what result?

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

- a)  $\lambda x. w w z$
- b)  $\lambda x. w z$
- c)  $w z$
- d) Does not reduce

## Quiz #8

---

Beta reducing the following term produces what result?

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

a)  $\lambda x. w w z$

b)  $\lambda x. w z$

c)  $w z$

d) Does not reduce