

Types and Type Based Analysis: Lambda Calculus, Intro to Haskell

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Announcements

- Quiz 4 on Abstract Interpretation

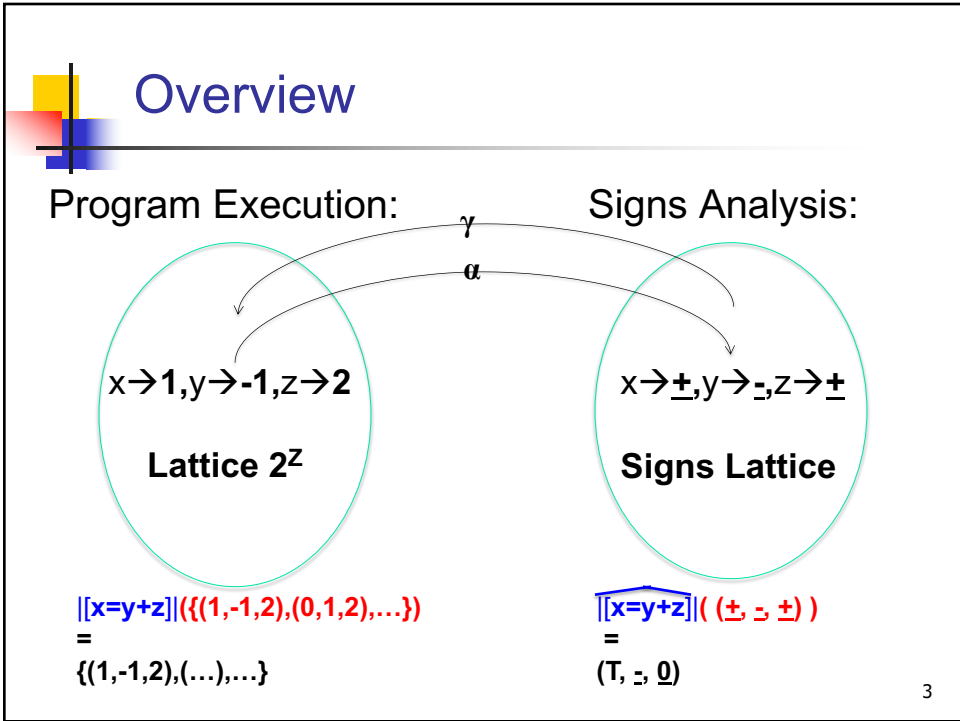
- HW5 is out
- Moving on to Types and Type-based Analysis

- Have a great Spring break!

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- ## Outline
- Pure lambda calculus, a review
 - Syntax and semantics
 - Free and bound variables
 - Rules (alpha rule, beta rule)
 - Normal forms
 - Reduction strategies
 - Interpreters for the Lambda calculus
 - Coding them in Haskell
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Lambda Calculus

- A theory of functions
 - Theory behind functional programming
 - Turing-complete: any computable function can be expressed and evaluated using the calculus
- Lambda (λ) calculus expresses **function definition** and **function application**
 - $f(x)=x*x$ becomes $\lambda x. x*x$
 - $g(x)=x+1$ becomes $\lambda x. x+1$
 - $f(5)$ becomes $(\lambda x. x*x) 5 \rightarrow 5*5 \rightarrow 25$

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Syntax of Pure Lambda Calculus

- λ -calculus formulae (e.g., $\lambda x. x y$) are called **expressions** or **terms**
- $E ::= x \mid (\lambda x. E_1) \mid (E_1 E_2)$
 - A λ -expression is one of
 - Variable: x
 - Abstraction (i.e., function definition): $\lambda x. E_1$
 - Application: $E_1 E_2$

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Syntactic Conventions

- Parentheses may be dropped from “stand-alone” terms $(E_1 E_2)$ and $(\lambda x. E)$
 - E.g., $(f x)$ may be written as $f x$
- Function application groups from left-to-right (i.e., it is left-associative)
 - E.g., $x y z$ abbreviates $((x y) z)$
 - E.g., $E_1 E_2 E_3 E_4$ abbreviates $(((E_1 E_2) E_3) E_4)$
 - Parentheses in $x (y z)$ are necessary! Why?

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Syntactic Conventions

- Application has higher precedence than abstraction
 - Another way to say this is that the scope of the dot extends as far to the right as possible
 - E.g., $\lambda x. x z = \lambda x. (x z) = (\lambda x. (x z)) = (\lambda x. (x z)) \neq ((\lambda x. x) z)$
- **WARNING:** This is the most common syntactic convention (e.g., Pierce 2002). However, some books give abstraction higher precedence; you might have seen that different convention

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Semantics of Lambda Calculus

- An expression has as its meaning the value that results after evaluation is carried out

- Somewhat informally, evaluation is the process of **reducing expressions**
E.g., $(\lambda x. \lambda y. x + y) 3 2 \rightarrow (\lambda y. 3 + y) 2 \rightarrow 3 + 2 = 5$
(Note: this example is just an informal illustration. There is no $+$ in the pure lambda calculus!)

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Free and Bound Variables


- Abstraction $(\lambda x. E)$ is also referred as binding
- Variable x is said to be **bound** in $\lambda x. E$

- The set of **free** variables of E is the set of variables that appear unbound in E
- Defined by cases on E
 - Var x : $\text{free}(x) = \{x\}$
 - App $E_1 E_2$: $\text{free}(E_1 E_2) = \text{free}(E_1) \cup \text{free}(E_2)$
 - Abs $\lambda x. E$: $\text{free}(\lambda x. E) = \text{free}(E) - \{x\}$

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Free and Bound Variables

- A variable x is **bound** if it is in the scope of a lambda abstraction: as in $\lambda x. E$
- Variable is free otherwise

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

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Free and Bound Variables

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

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Free and Bound Variables

- We must take free and bound variables into account when reducing expressions

E.g., $(\lambda x. \lambda y. x y) (y w)$

- First, rename bound y in $\lambda y. x y$ to z : $\lambda z. x z$

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

- Second, apply the reduction rule that substitutes $(y w)$ for x in the body $(\lambda z. x z)$

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

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Substitution, formally

- $(\lambda x. E) M \rightarrow E[M/x]$ replaces all free occurrences of x in E by M

- $E[M/x]$ is defined by cases on E :

- Var: $y[M/x] = M$ if $x = y$

$y[M/x] = y$ otherwise


- App: $(E_1 E_2)[M/x] = (E_1[M/x] E_2[M/x])$

- Abs: $(\lambda y. E_1)[M/x] = (\lambda y. E_1)$ if $x = y$

$(\lambda y. E_1)[M/x] = \lambda z. ((E_1[z/y])[M/x])$ otherwise,

where z NOT in $\text{free}(E_1) \cup \text{free}(M) \cup \{x\}$

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Substitution, formally

$$\begin{aligned}
 & (\lambda x. \lambda y. x y) (y w) \\
 \rightarrow & (\lambda y. x y)[(y w)/x] \\
 \rightarrow & \lambda 1_. (((x y)[1_/y])[(y w)/x]) \\
 \rightarrow & \lambda 1_. ((x 1_)[(y w)/x]) \\
 \rightarrow & \lambda 1_. ((y w) 1_) \\
 \rightarrow & \lambda 1_. y w 1_
 \end{aligned}$$

You will have to implement precisely this substitution algorithm in Haskell

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Rules (Axioms) of Lambda Calculus

- **α rule (α -conversion):** renaming of parameter (choice of parameter name does not matter)
 - $\lambda x. E \rightarrow_{\alpha} \lambda z. (E[z/x])$ provided z is not free in E
 - e.g., $\lambda x. x x$ is the same as $\lambda z. z z$

- **β rule (β -reduction):** function application (substitutes argument for parameter)
 - $(\lambda x. E) M \rightarrow_{\beta} E[M/x]$
 - Note: $E[M/x]$ as defined on previous slide!
 - e.g., $(\lambda x. x) z \rightarrow_{\beta} z$

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Rules of Lambda Calculus: Exercises

- Reduce

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

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

$(\lambda x. \lambda y. \lambda z. x z (y z)) (\lambda u. u) (\lambda v. v) \rightarrow ?$


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Rules of Lambda Calculus: Exercises

$(\lambda x. \lambda y. \lambda z. x z (y z)) (\lambda u. u) (\lambda v. v) \rightarrow_{\alpha\beta}$

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Reductions

- An expression $(\lambda x. E) M$ is called a **redex** (for reducible expression)
- An expression is in **normal form** if it cannot be β -reduced
- The normal form is the **meaning** of the term, the “answer”

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Definitions of Normal Form

- Normal form (NF): a term without redexes
- Head normal form (HNF)
 - x is in HNF
 - $(\lambda x. E)$ is in HNF if E is in HNF
 - $(x E_1 E_2 \dots E_n)$ is in HNF
- Weak head normal form (WHNF)
 - x is in WHNF
 - $(\lambda x. E)$ is in WHNF
 - $(x E_1 E_2 \dots E_n)$ is in WHNF

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Questions

- $\lambda z. z z$ is in NF, HNF, or WHNF?
- $(\lambda z. z z) (\lambda x. x)$ is in?
- $\lambda x. \lambda y. \lambda z. x z (y (\lambda u. u))$ is in?

- $(\lambda x. \lambda y. x) z ((\lambda x. z x) (\lambda x. z x))$ is in?
- $z ((\lambda x. z x) (\lambda x. z x))$ is in?
- $(\lambda z. (\lambda x. \lambda y. x) z ((\lambda x. z x) (\lambda x. z x)))$ is in?

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Simple Reduction Exercise

- $C = \lambda x. \lambda y. \lambda f. f x y$
- $H = \lambda f. f (\lambda x. \lambda y. x) \quad T = \lambda f. f (\lambda x. \lambda y. y)$
- What is $H (C a b)$?
 - $(\lambda f. f (\lambda x. \lambda y. x)) (C a b)$
 - $(C a b) (\lambda x. \lambda y. x)$
 - $((\lambda x. \lambda y. \lambda f. f x y) a b) (\lambda x. \lambda y. x)$
 - $(\lambda f. f a b) (\lambda x. \lambda y. x)$
 - $(\lambda x. \lambda y. x) a b$
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Exercise

An expression with no free variables is called **combinator**.
S, I, C, H, T are combinators.

- $S = \lambda x. \lambda y. \lambda z. x z (y z)$
- $I = \lambda x. x$
- What is $S I I I$?

Reducible expression is underlined at each step.

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

→ $(\lambda y. \lambda z. I z (y z)) I I$

→ $(\lambda z. I z (I z)) I$


→ $I I (I I) = (\lambda x. x) I (I I)$

→ $I (I I) = (\lambda x. x) (I I)$

→ $I I = (\lambda x. x) I \rightarrow I$

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Outline

- Pure lambda calculus, a review
 - Syntax and semantics
 - Free and bound variables
 - Rules (alpha rule, beta rule)
 - Normal form
 - **Reduction strategies**
- Lambda calculus interpreters
- Coding them in Haskell

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Reduction Strategy


- Let us look at $(\lambda x. \lambda y. \lambda z. x z (y z)) (\lambda u. u) (\lambda v. v)$
- Actually, there are (at least) two “reduction paths”:

Path 1: $(\lambda x. \lambda y. \lambda z. x z (y z)) (\lambda u. u) (\lambda v. v) \rightarrow_{\beta}$
 $(\lambda y. \lambda z. (\lambda u. u) z (y z)) (\lambda v. v) \rightarrow_{\beta}$
 $(\lambda z. (\lambda u. u) z ((\lambda v. v) z)) \rightarrow_{\beta} (\lambda z. z ((\lambda v. v) z)) \rightarrow_{\beta}$
 $\lambda z. z z$

Path 2: $(\lambda x. \lambda y. \lambda z. x z (y z)) (\lambda u. u) (\lambda v. v) \rightarrow_{\beta}$
 $(\lambda y. \lambda z. (\lambda u. u) z (y z)) (\lambda v. v) \rightarrow_{\beta}$
 $(\lambda y. \lambda z. z (y z)) (\lambda v. v) \rightarrow_{\beta} (\lambda z. z ((\lambda v. v) z)) \rightarrow_{\beta}$
 $\lambda z. z z$

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Reduction Strategy

- A reduction strategy (also called **evaluation order**) is a strategy for choosing redexes
 - How do we arrive at the normal form (answer)?
- **Applicative order reduction** chooses the leftmost-innermost redex in an expression
 - Also referred to as **call-by-value reduction**
- **Normal order reduction** chooses the leftmost-outermost redex in an expression
 - Also referred to as **call-by-name** reduction

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Reduction Strategy: Examples

- Evaluate $(\lambda x. x x) ((\lambda y. y) (\lambda z. z))$
- Using applicative order reduction:
 - $(\lambda x. x x) ((\lambda y. y) (\lambda z. z))$
 - $(\lambda x. x x) (\lambda z. z)$
 - $(\lambda z. z) (\lambda z. z) \rightarrow (\lambda z. z)$
- Using normal order reduction
 - $(\lambda x. x x) ((\lambda y. y) (\lambda z. z))$
 - $(\lambda y. y) (\lambda z. z) ((\lambda y. y) (\lambda z. z))$
 - $(\lambda z. z) ((\lambda y. y) (\lambda z. z))$
 - $(\lambda y. y) (\lambda z. z) \rightarrow (\lambda z. z)$

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Reduction Strategy

- In our examples, both strategies produced the same result. This is not always the case
 - First, look at expression $(\lambda x. x x) (\lambda x. x x)$. What happens when we apply β -reduction to this expression?
 - Then look at $(\lambda z. y) ((\lambda x. x x) (\lambda x. x x))$
 - Applicative order reduction – what happens?
 - Normal order reduction – what happens?

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Church-Rosser Theorem

- Normal form implies that there are no more reductions possible
- Church-Rosser Theorem, informally
 - If normal form exists, then it is unique (i.e., result of computation does not depend on the order that reductions are applied; i.e., no expression can have two distinct normal forms)
 - If normal form exists, then normal order will find it

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Reduction Strategy

- Intuitively:
 - Applicative order (**call-by-value**) is an **eager** evaluation strategy. Also known as **strict**
 - Normal order (**call-by-name**) is a **lazy** evaluation strategy
- What order of evaluation do most PLs use?

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Exercises

- Evaluate $(\lambda x. \lambda y. x y) ((\lambda z. z) w)$
- Using applicative order reduction

- Using normal order reduction

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Interpreters

- An interpreter for the lambda calculus is a program that reduces lambda expressions to “answers”

- We must specify
 - The definition of “answer”. Which normal form?
 - The reduction strategy. How do we choose redexes in an expression?

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Haskell syntax:
 let ... in
 case f of
 ->

An Interpreter

- Definition by cases on $E ::= x \mid \lambda x. E_1 \mid E_1 E_2$

$\text{interpret}(x) = x$
 $\text{interpret}(\lambda x. E_1) = \lambda x. E_1$
 $\text{interpret}(E_1 E_2) = \text{let } f = \text{interpret}(E_1)$
 in case f of
 $\lambda x. E_3 \rightarrow \text{interpret}(E_3[E_2/x])$
 - $\rightarrow f E_2$

- What normal form: Weak head normal form
- What strategy: Normal order

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Another Interpreter


- Definition by cases on $E ::= x \mid \lambda x. E_1 \mid E_1 E_2$

$\text{interpret}(x) = x$
 $\text{interpret}(\lambda x. E_1) = \lambda x. E_1$
 $\text{interpret}(E_1 E_2) = \text{let } f = \text{interpret}(E_1)$
 $a = \text{interpret}(E_2)$
 in case f of
 $\lambda x. E_3 \rightarrow \text{interpret}(E_3[a/x])$
 - $\rightarrow f a$

- What normal form: Weak head normal form
- What strategy: Applicative order

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- **Coding them in Haskell**

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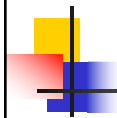


Coding them in Haskell

- In HW5 you will code an interpreter in Haskell
- Haskell
 - A functional programming language
- Key ideas
 - Lazy evaluation
 - Static typing and polymorphic type inference
 - Algebraic data types and pattern matching
 - Monads ... and more

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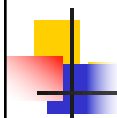


Lazy Evaluation

- Haskell implements **lazy evaluation**, i.e., **normal order reduction**
 - It won't evaluate an argument expr. until it is needed
- ```
> f x = [] // f takes x and returns the empty list
> f (repeat 1) // returns?
> []
> head (tail [1..]) // returns?
> 2 // [1..] is infinite list of integers
```
- Lazy evaluation allows us to work with infinite structures!

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## Static Typing and Type Inference

- Unlike Python, which is dynamically typed, Haskell is **statically typed**!
  - Unlike Java/C++ we don't always have to write type annotations. Haskell **infers** types!
    - A lot more on type inference later!
- ```
> f x = head x // f returns the head of list x
> f True // returns?
• Couldn't match expected type '[a]' with actual type 'Bool'
• In the first argument of 'f', namely 'True'
  In the expression: f True ...
```

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Algebraic Data Types

- Algebraic data types are **tagged unions** (aka sums) of **products** (aka records)

```
data Shape = Line Point Point
          | Triangle Point Point Point
          | Quad Point Point Point Point
```

union

Haskell keyword

new constructors (a.k.a. **tags**, disjuncts, summands)
Line is a binary constructor, Triangle is a ternary ...

the new type

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Algebraic Data Types in HW5

- Constructors create new values
- Defining a lambda expression

```
type Name = String
data Expr = Var Name
          | Lambda Name Expr
          | App Expr Expr
```

> **e1 = Var "x" // Lambda term x**

> **e2 = Lambda "x" e1 // Lambda term $\lambda x.x$**

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Examples of Algebraic Data Types

Polymorphic types.
a is a type parameter!

data Bool = True | False

data Day = Mon | Tue | Wed | Thu | Fri | Sat | Sun

data List **a** = Nil | Cons **a** (List **a**)

data Tree **a** = Leaf **a** | Node (Tree **a**) (Tree **a**)

data Maybe **a** = Nothing | Just **a**

Maybe type denotes that result of computation can be **a** or Nothing. Maybe is a **monad**.

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Data Constructors vs Type Constructors

- Data constructor constructs a “program object”
 - E.g., **Var**, **Lambda**, and **App** are data constructs
- Type constructor constructs a “type object”
 - E.g., **Maybe** is a unary type constructor

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Pattern Matching

Type signature of anchorPnt: takes a Shape and returns a Pnt.

- Examine values of an algebraic data type


```

anchorPnt :: Shape → Pnt
anchorPnt s = case s of
    Line    p1 p2 → p1
    Triangle p3 p4 p5 → p3
    Quad    p6 p7 p8 p9 → p6
  
```

- Two points
 - Test: does the given value match this pattern?
 - Binding: if value matches, bind corresponding values of **s** and pattern

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Pattern Matching in HW5

```

isFree :: Name → Expr → Bool
isFree v e =
  case e of
    Var n → if (n == v) then True else False
    Lambda ...
  
```

Type signature of **isFree**. In Haskell, all functions are **curried**, i.e., they take just one argument. **isFree** takes a variable name, and returns a function that takes an expression and returns a boolean.

Of course, we can interpret **isFree** as a function that takes a variable name **name** and an expression **E**, and returns true if variable **name** is free in **E**.

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