

## Lecture 2: Functional Programming

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### Why Functional?

- **Functional** Programming is **Fun!**
- Reflects the elegance of mathematics
- Pros
  - Simpler to learn
  - Higher productivity
  - Higher reliability
- Cons
  - Slower to execute
  - Inadequate for some problems

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### Historical Origins

- The imperative and functional models grew out of work undertaken Alan Turing, Alonzo Church, Stephen Kleene, Emil Post, etc. ~1930s
  - different formalizations of the notion of an algorithm, or effective procedure, based on automata, symbolic manipulation, recursive function definitions, and combinatorics
- These results led Church to conjecture that any intuitively appealing model of computing would be equally powerful as well
  - this conjecture is known as Church's thesis

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## Historical Origins

- Turing's model of computing was the Turing machine a sort of pushdown automaton using an unbounded storage "tape"
  - the Turing machine computes in an imperative way, by changing the values in cells of its tape – like variables just as a high level imperative program computes by changing the values of variables

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## Historical Origins

- Church's model of computing is called the lambda calculus
  - based on the notion of parameterized expressions (with each parameter introduced by an occurrence of the letter  $\lambda$ —hence the notation's name.
  - Lambda calculus was the inspiration for functional programming
  - one uses it to compute by substituting parameters into expressions, just as one computes in a high level functional program by passing arguments to functions

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## Functional Programming Concepts

- Functional languages such as Lisp, Scheme, FP, ML, Miranda, and Haskell are an attempt to realize Church's lambda calculus in practical form as a programming language
- The key idea: do everything by composing functions
  - no mutable state
  - no side effects

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## Functional Programming Concepts

- Necessary features, many of which are missing in some imperative languages
  - 1st class and high-order functions
  - serious polymorphism
  - powerful list facilities
  - recursion
  - structured function returns
  - fully general aggregates
  - garbage collection

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## Functions

- Function  $f$  has a domain  $D$  and a range  $R$
- Signature of a function  $f: D \rightarrow R$
- Function  $f$  is a subset of  $D \times R$  such that if  $(x, y_1)$  and  $(x, y_2)$  in  $f$ , then  $y_1 = y_2$ .
- All elements  $x \in D$  are associated unique elements  $y \in R$ , written as  $f(x)$ .
- Example:  $f: \mathbb{R} \rightarrow \mathbb{R}$   
 $x \rightarrow (x+1)/3$

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## Expressions

- Expressions are compositions of functions
- Constants are functions with no domain
- Example  
`append(append("a","b"),"c")`  
`if(x,if(y,1,2),3)`
- Recursive Example
  - Apply  $f: x \rightarrow (x+1)/3$  to itself:  $f(f(f(...)))$

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## Functional Programming

- A functional program is an expression  $E$
- Expression  $E$  represents program and input
- Expression is rewritten  $E$  by rewrite rules
  - Reductions replace sub-expression  $P$  of  $E$  by  $P'$  according to rewrite rules
  - Schematic notation:  
 $E[P] \Rightarrow E[P']$   
 where  $P \Rightarrow P'$  holds according to rewrite rules.
- Reduction is repeated until no reductions are applicable
- Result  $E^*$  is called Normal Form

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## Example

- Algebraic Expression  $(1+2)*(3+2)$
- Rewrite Rules (aka. Reduction System)
  - $a+b \Rightarrow c$  where  $c$  is addition of  $a$  and  $b$
  - $a*b \Rightarrow c$  where  $c$  is multiplication of  $a$  and  $b$
- Reductions / Normal Form

Step	E	P	P'
1	$(1+2)*(3+2)$	$1+2$	3
2	$3*(3+2)$	$3+2$	5
3	$3*5$	$3*5$	15

← Normal Form

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## Church-Rosser Property

- Normal form is independent of the order of the evaluation of sub-expression
- Example:
  - $(1+2)*(3+2) \Rightarrow 3*(3+2) \Rightarrow 3*5 \Rightarrow 15$
  - $(1+2)*(3+2) \Rightarrow (1+2)*5 \Rightarrow 3*5 \Rightarrow 15$

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## Lambda Calculus

- Expressions in Lambda Calculus may consist of
  - Variables  $V = \{v_1, v_2, \dots\}$
  - Anonymous functions (aka. Abstraction)
    - Function  $\lambda x.M[x]$  denotes the function  $x \rightarrow M[x]$
    - The period separates the parameter from the function body
    - Example:  $f(x) = x$  is written as  $\lambda x.x$
  - Function applications
    - Expression  $F A$  denotes function application of  $F$  to  $A$ .
    - Semantics:  $(\lambda x.M[x])N$  is  $M[x := N]$  where  $[x := N]$  denotes substitution of  $N$  for  $x$
    - Function application is called **Beta-Reduction**!

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## Variables in Lambda Calculus

- Bound Variables
  - Abstraction “binds” variables
  - Example:  $(\lambda x.zx)$  binds variable  $x$  but not  $z$
- Free Variables
  - Variables, which are not bound are “free”
  - Example:  $(\lambda x.y)$  makes variable  $y$  free

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## Inductive Definition

- Lambda expressions are elements of set  $\Lambda$ .
- Set  $\Lambda$  is defined inductively:
  - R1) if  $x \in V$ , then  $x \in \Lambda$ ,
  - R2) if  $x \in V$  and  $N \in \Lambda$ , then  $(\lambda x.N) \in \Lambda$ ,
  - R3) if  $M \in \Lambda$  and  $N \in \Lambda$ , then  $(MN) \in \Lambda$ ,
  - R4) nothing else is in set  $\Lambda$ .
- Set  $V = \{v_1, v_2, \dots\}$  is the set of variables.
- Example
  - Is expression  $((\lambda x.(\lambda y.(yx)))z)$  in  $\Lambda$ ?

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## Multiple Parameters / Currying

- Problem:
  - Lambda allows only a single argument for a function.
- A function with more than one argument is represented by **Currying**
- Idea:
  - An  $n$  argument function returns an  $(n-1)$  argument function, which returns an  $(n-2)$  argument function, etc.

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## Currying Example (cont'd)

- Example
  - Average two numbers, i.e.,  $f(x,y)=(x+y)/2$
  - Lambda Calculus (with arithmetic), i.e.,  $(\lambda x.(\lambda y. (x+y)/2))$
- Evaluation:
  - $((\lambda x.(\lambda y.(x+y)/2)) 5 7) \Rightarrow$
  - $((\lambda y.(5+y)/2) 7) \Rightarrow$
  - $(5+7)/2 \Rightarrow$
  - $6$
- Function is **partially evaluated**
  - First function returns  $(\lambda y.(5+y)/2)$
  - 7 is applied to result of first function
  - $(5+7)/2$  is evaluated and returned

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## Notation

- Too many parentheses
  - use implicit parenthesis rules to make life simpler
- For function application we use association to the left
  - Expression  $F M_1 M_2 \dots M_k$  denotes  $((\dots((F M_1) M_2) \dots) M_k)$
- For function abstraction we use association to the right
  - Expression  $\lambda x_1.x_2.\dots x_k.f(x_1,x_2,\dots,x_k)$  or  $\lambda x_1.\lambda x_2.\dots \lambda x_k.f(x_1,x_2,\dots,x_k)$  denotes  $(\lambda x_1. (\lambda x_2. (\dots (\lambda x_k.f(x_1,x_2,\dots,x_k)) \dots)))$

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## Reductions

- Beta Reduction: Function Application  
 $(\lambda x.M[x])N$  is  $M[x:=N]$
- Alpha Reduction: Renaming of Parameters  
 $(\lambda x.M[x])N$  is  $(\lambda y.M[y])N$   
 by applying replacement  $M[x:=y]$
- Eta Reduction: Simplification  
 $(\lambda x.(fx))$  is  $f$

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## Untyped Lambda Calculus

- Lambda Calculus does not have primitives
  - No numbers,
  - No arithmetic operations,
  - No aggregated data structures (structs, classes, etc.)
  - No control flow structures (only recursion!)
- However, it is computationally equivalent to a Turing Machine
- How can we present data types?
  - Data types can only be expressed by functions

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## Macros

- Lambda Expressions are assigned to labels
- Instead of spelling out lambda expressions labels can be used
- Improves readability!
- Example
  - Macro Definition:  $Ident = (\lambda x.x)$
  - Macro Usage:  $(Ident\ y) \Rightarrow ((\lambda x.x)\ y) \Rightarrow y$

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## Boolean & If

- Boolean constants
  - $\text{true} = (\lambda x. (\lambda y. (x)))$
  - $\text{false} = (\lambda x. (\lambda y. (y)))$
- Semantics of a conditional functions
  - Expression:  $(\text{if } \langle \text{cond} \rangle \langle f1 \rangle \langle f2 \rangle)$
  - If predicate  $\langle \text{cond} \rangle$  is true return result of  $\langle f1 \rangle$  otherwise  $\langle f2 \rangle$
- If-Macro
  - $\text{if} = (\lambda f.f)$

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## Example

$(\text{if true } a \ b) \Rightarrow$   
 $((\lambda f.f) \text{ true } a \ b) \Rightarrow$  ; expansion of if  
 $((((\lambda f.f) \text{ true}) a) \ b) \Rightarrow$  ; associates to the left  
 $((((\lambda f.f) (\lambda x. (\lambda y. (x)))) a) \ b) \Rightarrow$  ; expansion of true  
 $((((\lambda x. (\lambda y. (x)))) a) \ b) \Rightarrow$  ; evaluation of  $(\lambda f.f)$   
 $((\lambda y. (a)) \ b) \Rightarrow$  ; evaluation of true  
 $a$

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## Extensions

- Logical NOT
  - $\text{not} = \lambda f. \lambda x. \lambda y. (f \ y \ x)$
- Example
  - $(\text{not true}) =$ 
    - $((\lambda f. \lambda x. \lambda y. (f \ y \ x)) (\lambda x. (\lambda y. (x)))) \Rightarrow$  ; expansion
    - $((\lambda f. \lambda x. \lambda y. (f \ y \ x)) (\lambda a. (\lambda b. (a)))) \Rightarrow$  ; renaming/conflict
    - $(\lambda x. \lambda y. ((\lambda a. (\lambda b. (a))) \ y \ x)) \Rightarrow$  ; evaluation of f
    - $(\lambda x. \lambda y. (\lambda b. (y)) \ x) \Rightarrow$  ; evaluation of a
    - $\lambda x. \lambda y. y = \text{false}$

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## Extensions (cont'd)

- Logical OR
  - $or = \lambda f. \lambda g. \lambda x. \lambda y. (f \ x \ (g \ x \ y))$
- Logical AND
  - $and = \lambda f. \lambda g. \lambda x. \lambda y. (f \ (g \ x \ y) \ y)$
- How to prove it?
  - Evaluate for all four combinations, e.g.,
    - $(or \ true \ true) = true$
    - $(or \ false \ true) = true$
    - $(or \ true \ false) = true$
    - $(or \ false \ false) = false$

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## Recursive Data Types

- How to present non-negative integers in Lambda Calculus?
- Non-negative integers can be defined inductively, i.e.,
  - Basis Clause
    - 0 is a number and in the set of natural numbers
  - Inductive Clause
    - For any element  $x$  in the non-negative integers,  $x+1$  is element of the natural numbers.
  - Extremal Clause
    - Nothing is in the set of non-negative integers unless it is obtained by the inductive clause and basis clause
- Every number has a successor (or child)
- Without the extremal clause 0.5, 1.5, etc. would be in the set of natural numbers

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## Natural Numbers in Lambda

- Natural Numbers in Lambda Calculus have two constructors
  - Zero
  - Successor, i.e. give me next number
- Representation of Zero
  - $zero = \lambda x. \lambda y. y$
  - $s = \lambda x. \lambda y. \lambda z. (y \ (x \ y \ z))$
- Numbers
  - $zero = \lambda x. \lambda y. y$
  - $1 = (s \ zero) = \lambda x. \lambda y. (x \ y)$
  - $2 = (s \ (s \ zero)) = \lambda x. \lambda y. (x \ (x \ y))$
  - ....
  - $n = (s \ (s \ \dots \ zero))$
  - $= \lambda x. \lambda y. (x \ \dots \ (n-2 \ times) \ \dots (xy) \ \dots)$

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## Computations

- Arithmetic addition  
 $\text{add} = (\lambda nfx.f (n f x))$
- Arithmetic multiplication  
 $\text{mult} = (\lambda mnf.m(nf))$
- Proofs are more elaborate than logical AND and OR

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## LISP

- LISP is an old programming language
- Invented in 1958 by John McCarthy
- Was very popular in the AI boom
- Is a functional programming language
- Is a practical implementation of Lambda Calculus

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## LiSP - means List Processing

- LISP has atoms
  - Numbers, eg. 10
  - Identifiers, eg. Foo
  - Strings, eg. "filename"
- LISP has lists
  - can contain other lists
  - can contain atoms
  - can be empty
- Syntax:
  - $\langle \text{object} \rangle := \langle \text{atoms} \rangle \mid \langle \text{list} \rangle$
  - $\langle \text{list} \rangle := "(" \{ \langle \text{object} \rangle \} ")"$

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## List Examples in LISP

- (1 2 3)
- ()
- (+ 1 2)
- (\* (+ 1 2) (- 2 3))
- (sq 1 2)
- (setq a 100)
- (defun sq(n) (\* n n))
- (let ((a 6)) a)
- (if t 5 6)
- (cons 5 6)
- (cons (cons 6 7))

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## Concept of LISP

- LISP has as data structure model
  - Lists
  - Atoms
- Even programs are written as lists
- No other data structures exist

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## Evaluation

- Prefix notation of function calls as lists
  - Operation is first element
  - Second and following elements are arguments
  - (<operation><arg<sub>1</sub>> .... <arg<sub>n</sub>>)
- Examples
  - (+ 4 2)
  - (+ 3 (+3 2))
  - (sq (\* 4 2))

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## Numerical Functions

- Numerical operations
  - (+ 1 2 3)
  - (- 1 2)
  - (\* 1 3 4)
  - (/ 2 2)
- Square Root (sqrt x)
- Base Exponent (expt x y)
- Trigonometric Functions, (sin x) ...
- Absolute Value (abs x)
- Modulo (mod x y)
- Rounding (round x)

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## Interaction

- Interaction with lisp is done in a
  - *read-eval-print loop*
- Loop consists of following steps
  - Parse input and construct LISP object
  - Evaluate LISP object to produce output
  - Print output object
- Example:
  - (+ 1 2)
  - 3

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## Variables

- Variables can be defined by
  - (setq <var> <value>)
- Semantics
  - <var> = <value>
- Occurrence of variable symbol replaces variable symbol by the value of the variable
- Examples
  - (setq a (+ 5 3))
  - 8
  - A
  - 8

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## Quote

- If lists should not be evaluated use function quote
- Example
  - (setq a (+ 1 2))
  - 3
  - (setq a (quote (+ 1 2)))
  - (+ 1 2)
- There is a short form, just used ‘
- Example
  - (setq a ‘(+ 1 2))
  - (+ 1 2)

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## Conditional Function

- Definition  
(if <cond><true-value><false-value>)
- Boolean values in LISP are given by two symbols
  - symbol *nil* (is equal to empty list ie. `()`) represents *false*
  - *T* represents *true*
- Example
  - (if nil 1 2)
  - 2
  - (if (= 10 10) 1 2)
  - 1
  - (if () 1 2)
  - 2

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## Predicates

- Type Checking Predicates
  - (atom x) checks whether x is not a list, ie. number, symbol, string
  - (integerp x) checks whether x is an integer
  - (numberp x) checks whether x is a number
  - (stringp x) checks whether x is a string
- Numeric Predicates
  - (oddp x) checks whether x is integer and odd
  - (evenp x) checks whether x is integer and even
- Equality
  - (equal x y) checks equality
  - (eql x y) checks identity
  - (= x y) check numerical equality
- Logical operators
  - (or x y) for logical or
  - (and x y) for logical and

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## Functions

- Function Declaration  
(defun <name> (arg1 ... argn) body)
- (defun <name> (arg1 ... argn) body) **denotes**  
(setq <name> '(lambda (arg1 ... argn) body))
- Example
  - (defun factorial (x)
    - (if (= x 0)
    - 1
    - (\* x (factorial (- x 1)))
  - )
  - FACTORIAL
  - (factorial 4)
  - 24

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## Bindings

- Definition  
(let ((<name<sub>1</sub>><value<sub>1</sub>>) ..... (<name<sub>n</sub>><value<sub>n</sub>>)) body)
- Example
  - (let ((a 3) (b 4) (c 5))
    - (+ (\* a b) c)
  - )
  - a
  - Error: The variable A is unbound.
- Let allows local bindings of variables.
- Bindings might be nested
- Example (inner most binding for variable is taken)
  - (let ((a 3))
    - (let ((a 5))
    - a))

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## List Construction

- Construction with **cons**  
(cons <element> <list>)  
returns a new list with <element> as first element followed by elements by <list>
- Examples
  - (cons 1 nil)
  - (1)
  - (cons 'a '(bc))
  - (a bc)
- Construction with list  
(list <elem<sub>1</sub>> ... <elem<sub>n</sub>>)  
assembles new list with elements specified as arguments
- Example
  - (list 1 2 3)
  - (1 2 3)

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## List Access

- Access first element  
(first <list>)
- Example
  - (first '(a bc))  
a
- Access list without first element  
(rest <list>)
- Example
  - (rest '(a bc))  
(bc)

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