

# **Recursive Functions of Symbolic Expressions and Their Application, Part I**

JOHN MCCARTHY

Review: Amit Kirschenbaum  
Seminar in Programming Languages

# Historical Background

- **LISP** ( **LISt Processor** ) is the second oldest programming language and is still in widespread use today.
- Defined by John McCarthy from M.I.T.
- Development began in the 1950s at IBM as FLPL - Fortran List Processing Language.
- Implementation developed for the IBM 704 computer by the A.I. group at M.I.T.

# Historical Background (Cont'd)

“ The main requirement was a programming system for manipulating expressions representing formalized declarative and imperative sentences so that the Advice Taker could make deductions.”

Many dialects have been developed from LISP: Franz Lisp, MacLisp, ZetaLisp . . .

Two important dialects

- Common Lisp - ANSI Standard
- Scheme - A simple and clean dialect. Will be used in our examples.

# Imperative Programming

- Program relies on modifying a *state*, using a sequence of *commands*.
- State is mainly modified by *assignment*
- Commands can be executed one after another by writing them sequentially.
- Commands can be executed conditionally using **if** and repeatedly using **while**
- Program is a series of instructions on how to modify the state.

# Imperative Prog. (Cont'd)

- Execution of program can be considered, abstractly as:

$$s_0 \rightarrow s_1 \cdots \rightarrow s_n$$

- Program starts at state  $s_0$  including inputs
- Program passes through a finite sequence of state changes, by the commands, to get from  $s_0$  to  $s_n$
- Program finishes in  $s_n$  containing the outputs.

# Functional Programming

A functional program is an *expression*, and executing a program means *evaluating* the expression.

- There is no state, meaning there are no variables.
- No assignments, since there is nothing to assign to.
- No sequencing.
- No repetition but recursive functions instead.
- Functions can be used more flexibly.

# Why use it?

- At first glance, a language without variables, assignments and sequencing seems very impractical
- Imperative languages have been developed as an abstraction of hardware from machine-code to assembler to FORTRAN and so on.
- Maybe a different approach is needed i.e, from human side. Perhaps functional languages are more suitable to people.

# Advantages of functional programming

- Clearer semantics. Programs correspond more directly to mathematical objects.
- More freedom in implementation e.g, parallel programs come for free.
- The flexible use of functions we gain elegance and better modularity of programs.



# Some Mathematical Concepts

- Partial Function - function that is defined only of part of its domain.
- Propositional Expressions and Predicates - Expressions whose possible values are  $T$  (truth) and  $F$  (false).
- Conditional Expressions - Expressing the dependence of quantities on propositional quantities. Have the form

$$(p_1 \rightarrow e_1, \dots, p_n \rightarrow e_n)$$

Equivalent to

“If  $p_1$  then  $e_1$ , else if  $p_2$  then  $e_2$ ,  $\dots$  else if  $p_n$  then  $e_n$ ”

# Mathematical Concepts (Cont'd)

- Conditional expression can define **noncommutative** propositional connectives:

$$p \wedge q = (p \rightarrow q, T \rightarrow F)$$

$$p \vee q = (p \rightarrow T, T \rightarrow q)$$

$$\neg p = (p \rightarrow F, T \rightarrow T)$$

- Recursive function definitions - Using conditional expressions, we can define recursive functions

$$n! = (n = 0 \rightarrow 1, T \rightarrow n \cdot (n - 1)!)$$

- Functions are defined and used, using  $\lambda$ -notation.

# Brief intro to $\lambda$ -calculus

- A formal system designed to investigate
  - function definition
  - function application
  - recursion
- Can be called the *smallest universal programming language*.
- It is universal in the sense that any computable function can be expressed within this formalism.
- Thus, it is equivalent in expressive power to Turing machines.
- $\lambda$ -calculus was developed by *Alonzo Church* in the 1930s

# $\lambda$ -notation

Defining a function in mathematics means:

- Giving it a name.
- The value of the function is an expression in the formal arguments of the function.
- e.g.,  $f(x) = x + 1$

Using  $\lambda$ -notation we express it as a  $\lambda$ -expression

- $\lambda x . (+ x 1)$
- It has no name.
- prefix notation is used.

# $\lambda$ -notation (Cont'd)

- The function  $f$  may be applied to the argument 1 :

$$f(1)$$

- Similarly, the  $\lambda$ -expression may be applied to the argument 1

$$(\lambda x . (+ x 1))1$$

- Application here means
  - Subtitue 1 for  $x$ :  $(+ x 1) \Rightarrow (+ 1 1)$
  - Evaluate the function body: make the addition operation .
  - Return the result: 2

# Syntax of $\lambda$ -calculus

Pure  $\lambda$ -calculus contains just three kinds of expressions

- variables (identifiers)
- function applications
- $\lambda$ -abstractions (function definitions)

It is convenient to add

- predefined constants (e.g., numbers) and operations (e.g., arithmetic operators)

$$\langle exp \rangle ::=$$

	var
	const
	( $\langle exp \rangle \langle exp \rangle$ )
	( $\lambda$ var . $\langle exp \rangle$ )

# Function Application

- Application is of the form  $(E_1 E_2)$
- $E_1$  is expected to be evaluated to a function.
- The function may be either a predefined one or one defined by a  $\lambda$ -abstraction.

# $\lambda$ -abstractions

- The expression

$$(\lambda x . (* x 2))$$

is the function of  $x$  which multiplies  $x$  by 2

- The part of the expression that occurs after  $\lambda x$  is called the *body* of the expression.
- When application of  $\lambda$ -abstraction occurs, we return the result of the body evaluation.
- The body can be any  $\lambda$ -expression, therefore it may be a  $\lambda$ -abstraction.
- The parameter of  $\lambda$ -abstraction can be a function itself



# $\lambda$ -abstractions

- In mathematics there are also functions which return functions as values and have function arguments.
- Usually they are called *operators* or *functionals*
- For example: the differentiation operator

$$\frac{d}{dx} x^2 = 2x$$

.

# Constants

- Pure  $\lambda$ -calculus doesn't have any constants like  $0, 1, 2, \dots$  or built in functions like  $+, -, *, \dots$ , since they can be defined by  $\lambda$ -expressions.
- For the purpose of this discussion we'll assume we have them.

# Naming Expressions

- Expressions can be given names, for later reference:

square  $\equiv (\lambda x . (* x x))$

# Free and bound variables

- Consider the expression

$$(\lambda x . (* x y))2$$

- $x$  is bound: it is just the formal parameter of the function.
- $y$  is free: we have to know its value in advance.
- A variable  $v$  is called *bound* in an expression  $E$  if there is some use of  $v$  in  $E$  that is bound by a declaration  $\lambda v$  of  $v$  in  $E$ .
- A variable  $v$  is called *free* in an expression  $E$  if there is some use of  $v$  in  $E$  that is not bound by any declaration  $\lambda v$  of  $v$  in  $E$ .

# Reduction rule

- The main rule for simplifying expressions in  $\lambda$ -calculus is called  $\beta$ -reduction.
- Applying a  $\lambda$ -abstraction to an argument is an instance of its *body* in which *free* occurrences of the formal parameter are substituted by the argument.
- parameter may occur multiple times in the body

$$(\lambda x . (* x x))4 \rightarrow (* 4 4) \rightarrow 16$$

# Reduction rule

- Functions may be arguments

$$(\lambda f .(f 3))(\lambda x .(- x 1))$$

$$(\lambda f .(f 3))(\lambda x .(- x 1))$$

$$\rightarrow (\lambda x .(- x 1))3$$

$$\rightarrow (- 3 1)$$

$$\rightarrow 2$$

# Expressions for Recursive Functions

- The  $\lambda$ -notation is inadequate for defining functions recursively
- the function

$$n! = (n = 0 \rightarrow 1, T \rightarrow n \cdot (n - 1)!)$$

should be converted into

$$! = \lambda((n)(n = 0 \rightarrow 1, T \rightarrow n \cdot (n - 1)!))$$

- There is no clear reference from ‘!’ inside the  $\lambda$ -clause, to the expression as a whole.

# Expressions for Recursive Functions

- A new notation:  $label(a, \mathcal{E})$  denotes the expression  $\mathcal{E}$ , provided that occurrences of  $a$  within  $\mathcal{E}$  are to be referred as a whole.
- For example, for the latter function the notation would be

$$label(!, \lambda((n)(n = 0 \rightarrow 1, T \rightarrow n \cdot (n - 1)!))$$

- (There is a way to describe recursion in  $\lambda$ -calculus, using Y-combinator, but McCarthy doesn't use it.)



# S-Expressions

A new class of **S**ymbolic expressions.

S-Expression are composed of the special characters

- ( - start of composed expression
  - ) - end of composed expression
  - ● - composition
  - and “an infinite set of distinguishable **atomic symbols**”.
- e.g.,

A

ABA

APPLE-PIE-NUMBER-3

# S-Expression : Definition

- Atomic symbols are S-expression.
- if  $e_1$  and  $e_2$  are S-expressions then so is  $(e_1 \cdot e_2)$
- examples

AB

(A · B)

((AB · C) · D)

- S-expression is then simply an ordered pair.

# S-Expression : Lists

- The list

$$(m_1, m_2, \dots, m_n)$$

is represented by the S-expression

$$(m_1 \cdot (m_2 \cdot (\dots (m_n \cdot NIL) \dots)))$$

- $NIL$  is an atomic symbol, used to terminate lists, also known as the *empty list*.
- $(m)$  stands for  $(m \cdot NIL)$
- $(m_1, m_2, \dots, m_n \cdot x)$  stands for  $(m_1 \cdot (m_2 \cdot (\dots (m_n \cdot x) \dots)))$

# M-expressions

- **Meta-expressions** are functions of S-expressions, also called S-functions.
- Written in conventional functional notation.
- There are some elementary S-functions and predicates

# M-expressions

- **atom** -  $\text{atom}[x]$  has the value  $T$  or  $F$  according to whether  $x$  is atomic symbol.
  - $\text{atom}[X] = T$ .
  - $\text{atom}[(X \cdot A)] = F$ .
- **eq** -  $\text{eq}[x;y]$  is defined iff both  $x$  and  $y$  are symbols.  
 $\text{eq}[x;y] = T$  if  $x$  and  $y$  are the same symbol and  
 $\text{eq}[x;y] = F$  otherwise
  - $\text{eq}[X;X] = T$ .
  - $\text{eq}[X;A] = F$ .
  - $\text{eq}[X;(A \cdot B)]$  is undefined

# M-expressions

- **car** -  $\text{car}[x]$  is defined iff  $x$  is not atomic.

$$\text{car}[(e_1 \cdot e_2)] = e_1$$

- $\text{car}[(X \cdot A)] = X.$
- $\text{car}[(X \cdot A) \cdot Y] = (X \cdot A).$

- **cdr** -  $\text{cdr}[x]$  is also defined iff  $x$  is not atomic.

$$\text{cdr}[(e_1 \cdot e_2)] = e_2$$

- $\text{cdr}[(X \cdot A)] = A.$
- $\text{cdr}[(X \cdot A) \cdot Y] = Y.$

- **cons** -  $\text{cons}[x;y]$  is defined for any  $x$  and  $y$ . It is the list constructor

$$\text{cons}[(e_1;e_2)] = (e_1 \cdot e_2)$$

- $\text{cons}[X;A] = (X \cdot A).$
- $\text{cons}[(X \cdot A);Y] = ((X \cdot A) \cdot Y).$

# M-expressions

- Compositions of car and cdr arise very frequently.
- Many expressions can be written more concisely if we abbreviate.
- $\text{cadr}[x] \equiv \text{car}[\text{cdr}[x]]$
- $\text{caddr}[x] \equiv \text{car}[\text{cdr}[\text{cdr}[x]]]$
- $\text{cdadr}[x] \equiv \text{cdr}[\text{car}[\text{cdr}[x]]]$
- expressions are not defined for every x. depends on the list structure.

# Recursive S-functions

- Forming new functions of S-expression by conditional expression and recursive definition gives us much larger class of functions.
- In fact all computable functions.



# Recursive S-function examples

- $\text{ff}[x]$  - returns the first atomic symbol of the S-expression  $x$ , ignoring the parentheses.
- $\text{ff}[x] = [\text{atom}[x] \rightarrow x ; T \rightarrow \text{ff}[\text{car}[x]]]$

$$\begin{aligned} & \text{ff}[(A \cdot B)] \\ &= [\text{atom}[(A \cdot B)] \rightarrow (A \cdot B) ; T \rightarrow \text{ff}[\text{car}[(A \cdot B)]]] \\ &= [F \rightarrow (A \cdot B) ; T \rightarrow \text{ff}[\text{car}[(A \cdot B)]]] \\ &= \text{ff}[\text{car}[(A \cdot B)]] \\ &= \text{ff}[A] \\ &= \text{ff}[\text{atom}[A] \rightarrow A ; T \rightarrow \text{ff}[\text{car}[A]]] \\ &= [T \rightarrow A ; T \rightarrow \text{ff}[\text{car}[A]]] \\ &= A \end{aligned}$$

# Transform M-expressions to S-expressions

There is a transformation mechanism that translate an M-expression  $\mathcal{E}$  into S-expression  $\mathcal{E}^*$

- if  $\mathcal{E}$  is an S-expression,  $\mathcal{E}^*$  is (QUOTE  $\mathcal{E}$ ).
- M-expression  $f[e_1; \dots; e_n]$  is translated to  $(f^* e_1^* \dots e_n^*)$ .  
Thus,  $\{cons[A; B]\}^*$  is (CONS (QUOTE A) (QUOTE B))
- $\{[p_1 \rightarrow e_1]; \dots; [p_n \rightarrow e_n]\}^*$  is (COND  $(p_1^* e_1^*) \dots (p_n^* e_n^*)$ )
- $\{\lambda[x_1; \dots; x_n]\mathcal{E}\}^*$  is (LAMBDA  $(x_1 \dots x_n) \mathcal{E}^*$ ).
- $\{label[a; \mathcal{E}]\}^*$  is (LABEL a  $\mathcal{E}^*$ )

# What do we gain?

- Unifying Symbol-level and Meta-level, gives us a way to treat expressions over symbols exactly the same as symbols.
- Functions and data are **the same**.
- Thus we can write a program, which write another program and evaluating it.
- This is useful in AI.
- Furthermore, we can expand the language with new features.
- LISP interpreters are easily implemented in LISP.

# S-function *apply*

- “Plays the theoretical role of a universal Turing machine and the practical role of an interpreter”.
- Formally,
  - If  $f$  is an S-expression for an S-function  $f'$
  - and  $args$  is a list of arguments of the form  $(arg_1, \dots, arg_n)$  where  $arg_1, \dots, arg_n$  are S-expressions,
  - Then  $apply[f; args]$  and  $f'[arg_1, \dots, arg_n]$  are defined for the same values of  $arg_1, \dots, arg_n$  and are equal when defined.
- example:  $\lambda[[x; y]; cons[car[x]; y]] [(A, B); (C, D)] \equiv apply[(LAMBDA, (X, Y)(CONS(CAR X) Y))((A B)(C D))] = (A C D)$

# S-function *eval*

- serves both as a formal definition of the language and as an interpreter
- Before *apply* applies the function  $f$  on the list of arguments  $(arg_1, \dots, arg_n)$ , it sends them to *eval* for evaluating the S-expressions which represents them.

```
> (eval '(lambda (x) (+ x 1)))  
#<procedure>
```

```
'(lambda (x) (+ x 1))
```

is an S-expression which represents a function. *eval* evaluates it and return its value, which is indeed a function

# Implementing *eval*

```
(define (eval exp env)
  (cond ((self-evaluating? exp) exp)
        ((variable? exp) (lookup-variable-value exp env))
        ((quoted? exp) (text-of-quotation exp))
        ((assignment? exp) (eval-assignment exp env))
        ((definition? exp) (eval-definition exp env))
        ((if? exp) (eval-if exp env))
        ((lambda? exp)
         (make-procedure (lambda-parameters exp)
                          (lambda-body exp)
                          env))
        ((begin? exp)
         (eval-sequence (begin-actions exp) env))
        ((cond? exp) (eval (cond->if exp) env))
        ((application? exp)
         (apply (eval (operator exp) env)
                  (list-of-values (operands exp) env)))
        (else
         (error "Unknown expression type -- EVAL" exp))))
```

# Strength of the mechanism

- Extending the language is done easily by adding required forms to *eval*.
- Just add syntax and evaluation rules.
- Paraphrasing Oscar Wilde: LISP programmers know the value of everything but the cost of nothing.

# The cost

- Performance of LISP systems became a growing issue
  - Garbage Collection.
  - Representation of internal structures.
- Became difficult to run on the memory-limited hardware of that time.



# LISP Machines

- The solution was LISP machine - a computer which has been optimized to run LISP efficiently and provide a good environment for programming in it.
- Typical optimizations to LISP machines
  - Fast function calls.
  - Efficient representation of lists.
  - Hardware garbage collection.

# LISP in the real world

- de-facto standard in AI
- NLP
- Modelling speech and vision

Some more

- AutoCAD
- Yahoo Store
- Emacs
- Mirai, the 3d animation package was used to create Gollum in Lord Of The Rings.

# The End

```
( ( lambda ( x ) ( x x ) )  
  ( lambda ( x ) ( x x ) ) )
```