



CSCI-344

Programming Language Concepts (Section 3)

Lecture 7

Equational Reasoning and Algebraic Laws

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Scheme: one of the main dialects of Lisp (**List** processor)

Done:

- S-expressions
- Recursive definition of lists

This session: Algebraic Laws, Equational Proofs

Recursive Functions for Recursive Data Types

- List is a recursive datatype: it mentions itself in its own definition
- A **list** is constructed with `'()` or with `cons` applied to an atom and a smaller **list** (`cons a as`)
- Recursive functions are used for handling recursive data structures
- Recursive functions for processing lists:
 - Base case is usually `nil`
 - Inductive case is usually the rest or `cdr` of the list

Length

```
(define length (xs)
  (if (null? xs) 0
      (+ 1 (length (cdr xs)))
  )
)
```

```
length '(a b c)
= 1 + length '(b c)
= 1 + (1 + length '(c) )
= 1 + (1 + (1 + length '() ))
= 1 + (1 + (1 + 0))
= 3
```

Length

```
(define length (xs)
  (if (null? xs) 0
    (+ 1 (length (cdr xs))))
)
```

```
length '(a b c)
= 1 + length '(b c)
= 1 + (1 + length '(c))
= 1 + (1 + (1 + length '()))
= 1 + (1 + (1 + 0))
= 3
```

;;; tail-recursive

```
(define (length xs)
  (define (len xs n)
    (if (null? xs) n
      (len (cdr xs) (+ 1 n))
    )
  )
  (len xs 0))
```

```
(len '(a b c) 0)
= (len '(b c) 1)
= (len '(c) 2)
= 3
```

Algebraic Laws for Lists

- We can use **algebraic laws** to reduce and simplify complex expressions
 - Example: Identity law for addition
 - For any natural number x : $x + 0 = x$
 - This allows us to simplify the expression $x + 0$ to x
- The same way we can define algebraic laws for lists
 - Example: For all S-expressions x and y :

$$(\text{car } (\text{cons } x \ y)) = x$$

Algebraic Laws for Lists

Some Algebraic Laws: (there is an infinite number of laws)

| | | |
|---------------------------------|----------------|-----------------|
| <code>(null? '())</code> | <code>=</code> | <code>#t</code> |
| <code>(null? (cons x y))</code> | <code>=</code> | <code>#f</code> |
| <code>(pair? '())</code> | <code>=</code> | <code>#f</code> |
| <code>(pair? (cons x y))</code> | <code>=</code> | <code>#t</code> |
| <code>(car (cons x y))</code> | <code>=</code> | <code>x</code> |
| <code>(cdr (cons x y))</code> | <code>=</code> | <code>y</code> |

List Operations:

- **creators/producers:** `'()` , `(cons x y)`
- **observers:** `null?` , `pair?` , `car` , `cdr`

Append

- We can often transform algebraic laws for an operation to an actual Scheme program
- Consider the algebraic laws we want `append` to satisfy
- Assume `++` is an informal math notation for “followed by”

$$\begin{aligned}xs \ ++ \ '() &= xs \\'() \ ++ \ ys &= ys \\(x \ ++ \ xs) \ ++ \ ys &= x \ ++ \ (xs \ ++ \ ys) \\xs \ ++ \ (y \ ++ \ ys) &= (xs \ ++ \ y) \ ++ \ ys\end{aligned}$$

Append

- We can often transform algebraic laws for an operation to an actual Scheme program
- Consider the algebraic laws we want `append` to satisfy
- Assume `++` is an informal math notation for “followed by”

| | | |
|-------------------|-----|-------------------|
| $xs ++ '()$ | $=$ | xs |
| $'() ++ ys$ | $=$ | ys |
| $(x ++ xs) ++ ys$ | $=$ | $x ++ (xs ++ ys)$ |
| $xs ++ (y ++ ys)$ | $=$ | $(xs ++ y) ++ ys$ |

- `snoc`: reverse of `cons`

Append

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- Consider the algebraic laws we want `append` to satisfy
- Assume `++` is an informal math notation for “followed by”

| | | |
|------------------------------|----------------|------------------------------|
| <code>xs ++ '()</code> | <code>=</code> | <code>xs</code> |
| <code>'() ++ ys</code> | <code>=</code> | <code>ys</code> |
| <code>(x ++ xs) ++ ys</code> | <code>=</code> | <code>x ++ (xs ++ ys)</code> |
| <code>xs ++ (y ++ ys)</code> | <code>=</code> | <code>(xs ++ y) ++ ys</code> |

- `snoc`: reverse of `cons`
 - There is no `snoc` operation

Append

- We can often transform algebraic laws for an operation to an actual Scheme program
- Consider the algebraic laws we want `append` to satisfy
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$$\begin{aligned}xs \ ++ \ '() &= xs \\'() \ ++ \ ys &= ys \\(x \ ++ \ xs) \ ++ \ ys &= x \ ++ \ (xs \ ++ \ ys) \\~~xs \ ++ \ (y \ ++ \ ys) &= (xs \ ++ \ y) \ ++ \ ys~~\end{aligned}$$

- `snoc`: reverse of `cons`
 - There is no `snoc` operation

Append

- We can often transform algebraic laws for an operation to an actual Scheme program
- Consider the algebraic laws we want `append` to satisfy
- Assume `++` is an informal math notation for “followed by”

$$\begin{array}{lcl} xs \ ++ \ '() & = & xs \\ \left\{ \begin{array}{l} '() \ ++ \ ys \\ (x \ ++ \ xs) \ ++ \ ys \end{array} \right. & = & \begin{array}{l} ys \\ x \ ++ \ (xs \ ++ \ ys) \end{array} \\ \del{xs \ ++ \ (y \ ++ \ ys)} & = & \del{(xs \ ++ \ y) \ ++ \ ys} \end{array}$$

- `snoc`: reverse of `cons`
 - There is no `snoc` operation
- Complete case analysis on the first argument

Append

- We can often transform algebraic laws for an operation to an actual Scheme program
- Consider the algebraic laws we want `append` to satisfy
- Assume `++` is an informal math notation for “followed by”

$$\begin{array}{l} \del{x\ s\ ++\ '()\ } = \del{x\ s} \\ \left\{ \begin{array}{l} '()\ ++\ y\ s = y\ s \\ (x\ ++\ x\ s)\ ++\ y\ s = x\ ++\ (x\ s\ ++\ y\ s) \\ \del{x\ s\ ++\ (y\ ++\ y\ s)} = \del{(x\ s\ ++\ y)\ ++\ y\ s} \end{array} \right. \end{array}$$

- `snoc`: reverse of `cons`
 - There is no `snoc` operation
- Complete case analysis on the first argument

Append

- We can often transform algebraic laws for an operation to an actual Scheme program
- Consider the algebraic laws we want `append` to satisfy
- Assume `++` is an informal math notation for “followed by”

| | | |
|---|---------------------------|---|
| <code>xs ++ '()</code> | <code>=</code> | <code>xs</code> |
| <code>'() ++ ys</code> | <code>=</code> | <code>ys</code> |
| <code>(x ++ xs) ++ ys</code> | <code>=</code> | <code>x ++ (xs ++ ys)</code> |
| <code>xs ++ (y ++ ys)</code> | <code>=</code> | <code>(xs ++ y) ++ ys</code> |

```
(define (append xs ys)
  (if (null? xs) ys
      (cons (car xs) (append (cdr xs) ys))))
```

```
(define (append xs ys)
  (if (null? xs) ys
      (cons (car xs) (append (cdr xs) ys))))
```

- Major cost is `cons` because it corresponds to allocation
- How many pairs are allocated by the operation `(append xs ys)`?
- **Claim:** Cost of `append` is linear in length of the first argument
- **Proof:** Structural Induction.

```
(define (append xs ys)
  (if (null? xs) ys
      (cons (car xs) (append (cdr xs) ys))))
```

- We can define `snoc` in terms of `append`:

```
(define (snoc xs x) (append xs (list1 x)))
```

- The `list1` function maps an atom `x` to the singleton list containing `x`

```
(define (list1 x) (cons x '()))
```

List Reversal

Algebraic laws for list reversal:

| |
|---|
| <pre>reverse '() = '() reverse (x ++ xs) = (reverse xs) ++ x</pre> |
|---|

Scheme implementation corresponding the algebraic laws:

```
(define reverse (xs)
  (if (null? xs) '()
      (append (reverse (cdr xs))
              (list1 (car xs)))))
```

List Reversal

Algebraic laws for list reversal:

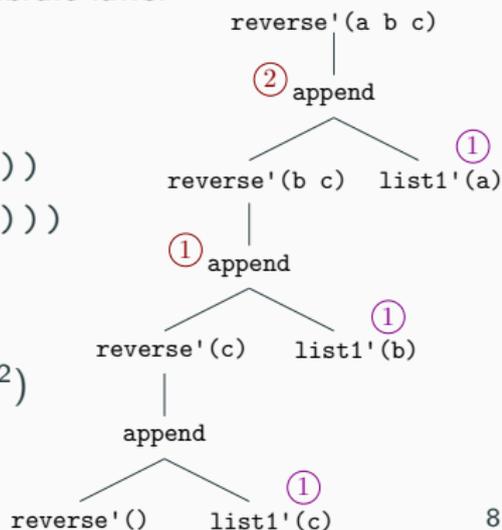
$$\begin{aligned} \text{reverse '()} &= \text{'()} \\ \text{reverse (x ++ xs)} &= (\text{reverse xs}) ++ \text{x} \end{aligned}$$

Scheme implementation corresponding the algebraic laws:

```
(define reverse (xs)
  (if (null? xs) '()
      (append (reverse (cdr xs))
              (list1 (car xs)))))
```

How many pairs are constructed?

$$((n-1) + (n-2) + \dots + 1) + n(1) = O(n^2)$$



List Reversal (Accumulating Parameter)

Consider a different set of algebraic laws for list reversal:

$$\begin{array}{lcl} (\text{reverse } (x \text{ ++ } xs)) \text{ ++ } zs & = & (\text{reverse } xs) \text{ ++ } x \text{ ++ } zs \\ \text{reverse '() ++ } zs & = & zs \end{array}$$

```
(define revapp (xs zs)
  (if (null? xs) zs
      (revapp (cdr xs)
              (cons (car xs) zs))))

(define reverse (xs) (revapp xs '()))
```

List Reversal (Accumulating Parameter)

Consider a different set of algebraic laws for list reversal:

$$\begin{aligned} (\text{reverse } (x \text{ ++ } xs)) \text{ ++ } zs &= (\text{reverse } xs) \text{ ++ } x \text{ ++ } zs \\ \text{reverse '() ++ } zs &= zs \end{aligned}$$

```
(define revapp (xs zs)
  (if (null? xs) zs
      (revapp (cdr xs)
              (cons (car xs) zs))))

(define reverse (xs) (revapp xs '()))
```

- The cost of this version is linear in the length of the list being reversed
- Parameter `zs` is the accumulating parameter (powerful and general technique)

Equational Reasoning

- How can we prove different properties of programs?
- Take a set of laws as definition for primitive operations
 - e.g. `car`, `cons`, `cdr`
- Use “Equational Reasoning”: substituting equals by equals for the rest of operations
 - e.g. `length`, `append`, `reverse`
- Equational reasoning expands (or contract) definitions of functions

$$\begin{array}{l} term_1 \\ = \{ \text{Justification that } term_1 = term_2 \} \\ term_2 \end{array}$$

Equational Reasoning: Example Proof

Theorem: $(\text{append } '() \text{ } xs) = xs$

Proof:

$(\text{append } '() \text{ } xs)$

Equational Reasoning: Example Proof

Theorem: `(append '() xs) = xs`

Proof:

```
(append '() xs)
= {substitute actual parameters in definition of append}
(if (null? '())
    xs
    (cons (car '()) (append (cdr '()) xs)))
```

Equational Reasoning: Example Proof

Theorem: `(append '() xs) = xs`

Proof:

```
(append '() xs)
= {substitute actual parameters in definition of append}
(if (null? '())
    xs
    (cons (car '()) (append (cdr '()) xs)))
= {null?-empty law}
(if #t
    xs
    (cons (car '()) (append (cdr '()) xs)))
```

Equational Reasoning: Example Proof

Theorem: `(append '() xs) = xs`

Proof:

```
(append '() xs)
= {substitute actual parameters in definition of append}
(if (null? '())
    xs
    (cons (car '()) (append (cdr '()) xs)))
= {null?-empty law}
(if #t
    xs
    (cons (car '()) (append (cdr '()) xs)))
= {if-#t law}
xs
```

Equational Reasoning: Examples

- We can prove the following properties using equational reasoning

1. append-empty-left law:

$$(\text{append } '() \text{ } xs) = xs$$

2. append-cons-left law:

$$(\text{append } (\text{cons } x \text{ } xs) \text{ } ys) = (\text{cons } x \text{ } (\text{append } xs \text{ } ys))$$

3. length-empty law:

$$(\text{length } '()) = 0$$

4. length-cons law:

$$(\text{length } (\text{cons } x \text{ } xs)) = (+ 1 \text{ } (\text{length } xs))$$

- How can we prove

$$(\text{length } (\text{append } xs \ ys)) = (+ (\text{length } xs) (\text{length } ys))?$$

Structural Induction

- How can we prove $(\text{length } (\text{append } xs \ ys)) = (+ (\text{length } xs) (\text{length } ys))$?
- Equational Reasoning (replacing equals for equals) never stops expanding
- We need a more powerful technique: structural induction

Base Case: Prove the theorem is true for empty list ' ()

Inductive Step: Assume the theorem is true for the list xs , prove it is also true for (**cons** x xs)

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

$(\text{append } '() \ xs) = xs$

(1)

$(\text{length } '()) = 0$

(3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$

(2)

$(\text{length } (\text{cons } x \ xs)) =$

$(\text{cons } x \ (\text{append } xs \ ys))$

$(+ \ 1 \ (\text{length } xs))$

(4)₁₄

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ (\text{length } xs) (\text{length } ys))$

Base Case: $xs = '()$
 $(\text{length } (\text{append } '() \ ys))$

$(\text{append } '() \ xs) = xs$ (1) $(\text{length } '()) = 0$ (3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$ (2) $(\text{length } (\text{cons } x \ xs)) =$ (4)
 $(\text{cons } x \ (\text{append } xs \ ys))$ $(+ 1 (\text{length } xs))$ 14

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ (\text{length } xs) (\text{length } ys))$

Base Case: $xs = '()$
 $(\text{length } (\text{append } '() \ ys))$
 $= \{(1)\}$
 $(\text{length } ys)$

$(\text{append } '() \ xs) = xs$ (1) $(\text{length } '()) = 0$ (3)

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Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

Base Case: $xs = '()$

$$\begin{aligned} & (\text{length } (\text{append } '() \ ys)) \\ &= \{(1)\} \\ & (\text{length } ys) \\ &= \{\text{additive Identity}\} \\ & (+ \ 0 \ (\text{length } ys)) \end{aligned}$$

$(\text{append } '() \ xs) = xs$ (1) $(\text{length } '()) = 0$ (3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$ (2) $(\text{length } (\text{cons } x \ xs)) =$ (4)
 $(\text{cons } x \ (\text{append } xs \ ys))$ (+ 1 (\text{length } xs)) 14

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

Base Case: $xs = '()$

$(\text{length } (\text{append } '() \ ys))$

$= \{(1)\}$

$(\text{length } ys)$

$= \{\text{additive Identity}\}$

$(+ \ 0 \ (\text{length } ys))$

$= \{(3)\}$

$(+ \ (\text{length } '()) \ (\text{length } ys))$

$(\text{append } '() \ xs) = xs$

(1)

$(\text{length } '()) = 0$

(3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$

(2)

$(\text{length } (\text{cons } x \ xs)) =$

$(\text{cons } x \ (\text{append } xs \ ys))$

$(+ \ 1 \ (\text{length } xs))$

(4)₁₄

Structural Induction

Theorem: $(\text{length } (\text{append } xs \text{ } ys)) = (+ (\text{length } xs) (\text{length } ys))$

Base Case: $xs = '()$

$(\text{length } (\text{append } '() \text{ } ys))$

$= \{(1)\}$

$(\text{length } ys)$

$= \{\text{additive Identity}\}$

$(+ 0 (\text{length } ys))$

$= \{(3)\}$

$(+ (\text{length } '()) (\text{length } ys))$

$= \{\text{substitute } xs\}$

$(+ (\text{length } xs) (\text{length } ys))$

$(\text{append } '() \text{ } xs) = xs$

(1)

$(\text{length } '()) = 0$

(3)

$(\text{append } (\text{cons } x \text{ } xs) \text{ } ys) =$

(2)

$(\text{length } (\text{cons } x \text{ } xs)) =$

(4)¹⁴

$(\text{cons } x \text{ } (\text{append } xs \text{ } ys))$

$(+ 1 (\text{length } xs))$

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ (\text{length } xs) (\text{length } ys))$

Inductive Step: Suppose theorem holds for xs prove it holds for $(\text{cons } x \ xs)$

$$(\text{append } '() \ xs) = xs \qquad (1) \qquad (\text{length } '()) = 0 \qquad (3)$$

$$(\text{append } (\text{cons } x \ xs) \ ys) = \qquad (2) \qquad (\text{length } (\text{cons } x \ xs)) = \qquad (4)_{14}$$
$$(\text{cons } x \ (\text{append } xs \ ys)) \qquad (+ 1 (\text{length } xs))$$

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ (\text{length } xs) (\text{length } ys))$

Inductive Step: Suppose theorem holds for xs prove it holds for $(\text{cons } x \ xs)$
 $(\text{length } (\text{append } (\text{cons } x \ xs) \ ys))$

$$(\text{append } '() \ xs) = xs \qquad (1) \qquad (\text{length } '()) = 0 \qquad (3)$$

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$$(\text{cons } x \ (\text{append } xs \ ys)) \qquad (+ 1 (\text{length } xs))$$

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

Inductive Step: Suppose theorem holds for xs prove it holds for $(\text{cons } x \ xs)$

$(\text{length } (\text{append } (\text{cons } x \ xs) \ ys))$

$= \{(2)\}$

$(\text{length } (\text{cons } x \ (\text{append } xs \ ys)))$

$(\text{append } '() \ xs) = xs$

(1) $(\text{length } '()) = 0$

(3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$

(2) $(\text{length } (\text{cons } x \ xs)) =$

(4)₁₄

$(\text{cons } x \ (\text{append } xs \ ys))$

$(+ \ 1 \ (\text{length } xs))$

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

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$= \{(4)\}$

$(+ \ 1 \ (\text{length } (\text{append } xs \ ys)))$

$(\text{append } '() \ xs) = xs$

$(1) \quad (\text{length } '()) = 0$

(3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$

$(2) \quad (\text{length } (\text{cons } x \ xs)) =$

$(4)_{14}$

$(\text{cons } x \ (\text{append } xs \ ys))$

$(+ \ 1 \ (\text{length } xs))$

Structural Induction

Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

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$(\text{length } (\text{append } (\text{cons } x \ xs) \ ys))$

$= \{(2)\}$

$(\text{length } (\text{cons } x \ (\text{append } xs \ ys)))$

$= \{(4)\}$

$(+ \ 1 \ (\text{length } (\text{append } xs \ ys)))$

$= \{\text{by inductive hypothesis}\}$

$(+ \ 1 \ (\text{length } xs) \ (\text{length } ys))$

$(\text{append } '() \ xs) = xs$

(1)

$(\text{length } '()) = 0$

(3)

$(\text{append } (\text{cons } x \ xs) \ ys) =$

(2)

$(\text{length } (\text{cons } x \ xs)) =$

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(4)₁₄

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Theorem: $(\text{length } (\text{append } xs \ ys)) = (+ \ (\text{length } xs) \ (\text{length } ys))$

Inductive Step: Suppose theorem holds for xs prove it holds for $(\text{cons } x \ xs)$

$(\text{length } (\text{append } (\text{cons } x \ xs) \ ys))$

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$(\text{length } (\text{cons } x \ (\text{append } xs \ ys)))$

$= \{(4)\}$

$(+ \ 1 \ (\text{length } (\text{append } xs \ ys)))$

$= \{\text{by inductive hypothesis}\}$

$(+ \ 1 \ (\text{length } xs) \ (\text{length } ys))$

$= \{(4)\}$

$(+ \ (\text{length } (\text{cons } x \ xs)) \ (\text{length } ys))$

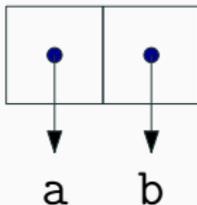
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 $(\text{cons } x \ (\text{append } xs \ ys))$ (+ 1 (\text{length } xs)) 14

Proper List

- Lists that we considered in this lecture are more precisely known as **Proper Lists**
- A proper list is either the empty list, or a pair whose `cdr` is a proper list
- `cons` is not for just building list: it can pair any two values
- `(cons 'a 'b)` is not a proper list
- The pair that is not a proper list is represented by dot notation:

`(a . b)`



Summary

This Lecture

- Recursive functions for processing lists
- We discuss equational reasoning and structural induction

Next Lecture

- Functions as first-class citizens

