

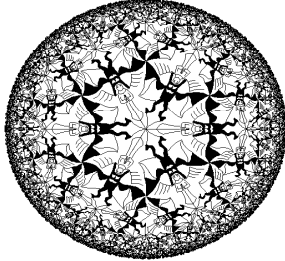
アルゴリズムとデータ構造入門

2.3 記号データ (Symbolic Data)

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12月14日・本日のメニュー

- 2.2.3 Symbolic Data
- 2.3.2 Symbolic Differentiation
- 2.3.3 Representing Sets
- 2.4 Multiple Representations for Abstract Data
- 2.4.1 Representations for Complex Numbers



12月21日中間試験 1.1.1~2.2.2



12月14日・本日のメニュー

- 2.3 Symbolic Data
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2.3.1 Quotation

定数データの表現: quote (引用) '

• (define foo (list 'a 'b))
⇒ (a b) (define foo '(a b)) と同じ

• eq? 2つの要素が同一か。コピーは eq? ではない!

• (define (memq item x)
(cond ((null? x) false)
((eq? item (car x)) x)
(else (memq item (cdr x)))))

• (memq 'banana '(pear banana prune))
⇒ (banana prune)

• (memq '(a b) '(pear (a b) prune))
⇒ false

• (memq foo (list 'pear foo 'prune))
⇒ ((a b) prune)

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微分を定義を思い出そう

- $\frac{dc}{dx} =$ c が定数か x 以外の変数
- $\frac{dx}{dx} =$
- $\frac{d(u+v)}{dx} =$
- $\frac{d(uv)}{dx} =$

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代数式の表現を考えてください

• 次の代数式の表現法

1. 和 $x + y$

2. 積 ax

• 代数式のための構築子・選択子・述語の設計

1. 構築子 (constructor)

(make-sum x y)
(make-product x y)

2. 選択子 (selector)

(addend s)
(augend s)
(multiplicand p)
(multiplier p)

3. 述語 (predicate)

(variable? x)
(same-variable? x y)
(sum? x)
(product? x)

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代数式の構文

::= は定義

| は代替

```
<expression> ::= <number> | <variable> |
  ( <unary operator> <expression> ) |
  ( <binary operator> <expression> <expression> ) |
  <expression>

<unary operator> ::= + | - | <function>

<binary operator> ::= + | - | * | / | ^ | < | > | = | <= | >=

<function> ::= sin | cos | tan | log | ...
```

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代数式の表現法とその実装

- 次の代数式の表現法

	表現法1	表現法2
1. 和	$x + y$	$(+ \ (x \ y))$
2. 積	xy	$(* \ (x \ y))$
- 代数式のための構築子・選択子の設計
 - 構築子


```
(define (make-sum x y)
  (list '+ x y))
(define (make-product x y)
  (list '* x y))
```
 - 選択子


```
(define (addend s) (cadr s))
(define (augend s) (caddr s))
(define (multiplicand p) (cadr p))
(define (multiplier p) (caddr p))
```

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代数式表現の実装(続)

- 代数式のための構築子・選択子・述語の設計

3. 述語

```
(define (variable? x) (symbol? x))
(define (same-variable? x y)
  (and (variable? x) (eq? x y)))
(define (sum? x)
  (and (pair? x)
        (eq? (car x) '+)))
(define (product? x)
  (and (pair? x)
        (eq? (car x) '*)))
```

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代数式の表現法2を採用すると

- 次の代数式の表現法

	表現法1	表現法2
1. 和	$x + y$	$(+ \ (x \ y))$
2. 積	ax	$(* \ (x \ y))$
- 代数式のための構築子・選択子の設計
 - 構築子


```
(define (make-sum x y)
  (list '+ (list x y)))
(define (make-product x y)
  (list '* (list x y)))
```
 - 選択子


```
(define (addend s) (caadr s))
(define (augend s) (cadadr s))
(define (multiplicand p) (caadr p))
(define (multiplier p) (cadadr p))
```

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では微分手続きを定義してください

$$\frac{dc}{dx} = 0$$

$$\frac{dx}{dx} = 1$$

$$\frac{d(u+v)}{dx} = \frac{du}{dx} + \frac{dv}{dx}$$

$$\frac{d(uv)}{dx} = u \frac{dv}{dx} + v \frac{du}{dx}$$

```
(define (deriv exp var)
  (cond ((number? exp) 0)
        ((variable? exp)
         (if (same-variable? exp var) 1 0))
        ((sum? exp)
         (make-sum (deriv (addend exp) var)
                     (deriv (augend exp) var)))
        ((product? exp)
         (make-sum
          (make-product (multiplier exp)
                        (deriv (multiplicand exp)
                               var))
          (make-product (deriv (multiplier exp)
                               var)
                        (multiplicand exp))))
        (else
         (error "unknown expression type -
                DERIV" exp))))
```

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代数式の表現・実装の問題点

- (deriv '(+ x y) 'x)
 $(+ \ 1 \ 0)$
- (deriv '(* x y) 'x)
 $(+ \ (* \ y \ 1) \ (* \ 0 \ x))$
- (deriv '(+ (* x y) (* 3 x)) 'x)
 $(+ \ (+ \ (* \ y \ 1) \ (* \ 0 \ x)) \ (+ \ (* \ x \ 0) \ (* \ 1 \ 3)))$

何かおかしい

簡略化を忘れている。

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微分結果の簡約化(その1)

- どの時点で簡略化をすればよいか.

```
(define (make-sum a1 a2)
  (cond ((=number? a1 0) a2)
        ((=number? a2 0) a1)
        ((and (number? a1) (number? a2))
         (+ a1 a2))
        (else (list '+ a1 a2)) ))

(define (=number? exp num)
  (and (number? exp) (= exp num)) )
```

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微分結果の簡約化(その2)

```
(define (make-product m1 m2)
  (cond ((or (=number? m1 0)
              (=number? m2 0) )
        0 )
        ((=number? m1 1) m2)
        ((=number? m2 1) m1)
        ((and (number? m1) (number? m2))
         (* m1 m2))
        (else (list '* m1 m2)) ))
```

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和と積に対する微分を拡張

- 差、商に拡張


```
(deriv '(- x y) 'x)
(deriv '(/ 3 x) 'x)
```
- 乗算に拡張


```
(deriv '(** x 3) 'x)
```
- 2項演算子を多項演算子に拡張


```
(deriv '(+ (* 3 x) y (* x y)) 'x)
(deriv '(* x y (+ x 3)) 'x)
```
- 任意の関数が自由に付加できる微分システム

2.5.3 Data-Directed Programming and Additivity

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記号微分の拡張法

```
(define (deriv exp var)
  (cond ((number? exp) 0)
        ((variable? exp)
         (if (same-variable? exp var) 1 0) )
        ((sum? exp)
         (make-sum (deriv (addend exp) var)
                     (deriv (augend exp) var)) )
        ((product? exp)
         (make-sum
          (make-product (multiplier exp)
                        (deriv (multiplicand exp) var) )
          (make-product (deriv (multiplier exp) var)
                        (multiplicand exp) )))
        (else
         (error "unknown expression type - DERIV" exp) )))
```

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差・商に対する微分ルールを追加

- 差は `(* -1 <exp>)` で表現


```
(- x y)      (+ x (* -1 y))
```
- 商は `(/ <exp1> <exp2>)` で表現


```
(define (make-division d1 d2)
  (cond ((=number? d1 0) 0)
        ((=number? d2 1) d1)
        ((and (number? d1) (number? d2))
         (/ d1 d2))
        (else (list '/ d1 d2)) ))

(define (divident d) (cadr d))
(define (divisor d) (caddr d))
(define (division? x)
  (and (pair? x) (eq? (car x) '/)) )
```

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商に対する微分ルールを追加

```
((division? exp)
 (make-sum
  (make-product
   (make-division
    (make-product
     (make-product -1
                     (divident exp) )
     (deriv (divisor exp) var) )
    (make-product
     (divisor exp)
     (divisor exp) )))
  (make-product
   (make-division 1 (divisor exp))
   (deriv (divident exp) x) )))
```

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$$\frac{d}{dx} \frac{u}{v} = -\frac{u}{v^2} \frac{dv}{dx} + \frac{1}{v} \frac{du}{dx}$$



冪乗に対する表現法と基本手続き

冪乗は `(** <base> <exponent>)` で表現

```
(define (make-exponentiation b e)
  (cond ((=number? e 0) 1)
        ((=number? e 1) b)
        ((=number? b 1) 1)
        ((and (number? b) (number? e))
         (** b e))
        (else (list '** b e))))

(define (base x) (cadr x))
(define (exponent x) (caddr x))
(define (exponentiation? x)
  (and (pair? x) (eq? (car x) '**)))
```

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冪乗に対する微分ルールを追加

```
((exponentiation? exp)
 (make-product
  (make-product
   (exponent exp)
   (deriv (base exp) var) )
  (make-exponentiation
   (base exp)
   (make-sum (exponent exp) -1) )))
```

$$\frac{d}{dx} b^e = e b^{e-1} \frac{db}{dx}$$

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三角関数に対する微分ルールを追加

関数は `(<func> <args>)` で表現

```
((sin? exp)
 (make-product
  (make-function
   'cos
   (argument exp) )
  (deriv (argument exp) var) ))

(define (make-function func . args)
  (cons func args))
```

$$\frac{d}{dx} \sin(u) = \cos(u) \frac{du}{dx}$$

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記号微分の拡張 (1)

1. 差、商に拡張


```
(deriv '(- x y) 'x)
(deriv '(/ 3 x) 'x)
```
2. 冪乗に拡張


```
(deriv '(** x 3) 'x)
```
3. 2項演算子を多項演算子に拡張


```
(deriv '(+ (* 3 x) y (* x y)) 'x)
(deriv '(* x y (+ x 3)) 'x)
```

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記号微分の拡張(2)

4. 2項演算子を多項演算子に拡張

augend, multiplierの定義を変更するだけで
`(deriv '(+ x (* x y) (** x 3)) 'x)`
 に対応できる。
 5. 多項式の整理
 - 多項式を降冪あるいは昇冪の順に整列
 - 多項式を簡略化により整理
- 2.5.3 記号代数(Symbolic Algebra)**
6. 任意の関数が自由に付加できる微分システム

2.5.3 Data-Directed Programming and Additivity

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12月14日・本日のメニュー

1. 2.3 Symbolic Data
2. 2.3.2 Symbolic Differentiation
3. 2.3.3 Representing Sets
4. 2.4 Multiple Representations for Abstract Data
5. 2.4.1 Representations for Complex Numbers



集合(set)の表現

- 自然数の集合を定義してみよう
 - $\{0, 1, 2, 3, \dots\}$
外延的記法 (extensional notation)
 - $S = \{n | 0, n+1 \text{ if } n \in S\}$
内延的記法 (intentional notation)
- 外延的記法での課題
次の定義のどちらがよいか？
 - $\{0, 2, 4, 6, 8, 10, 12, 14, 16, 18, 20, \dots\}$
 - $\{0, 10, 20, 30, 2, 12, 22, 24, 4, 14, 24, \dots\}$

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集合(set)の手続きと表現法

- 集合の手続き
 - union-set $S \cup T$
 - intersection-set $S \cap T$
 - element-of-set? $e \in T$
 - adjoin-set $\{e\} \cup S$
- 集合の表現法の実装 (implementation)
 - 順序なし表現 (unordered list)
 $\{30, 0, 20, 10, 22, 2, 12, 24, 34, \dots\}$
 $(30\ 0\ 20\ 10\ 22\ 2\ 12\ 24\ 34\ \dots)$
 - 順序付き表現 (ordered list)
 $\{0, 2, 4, 6, 8, 10, 12, 14, 16, 18, 20, \dots\}$
 $(0\ 2\ 4\ 6\ 8\ 10\ 12\ 14\ 16\ 18\ \dots)$

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集合(set)のUnordered List表現

```
(define (element-of-set? x set)
  (cond ((null? set) false)
        ((equal? x (car set)) true)
        (else (element-of-set? x (cdr set)))))

(define (adjoin-set x set)
  (if (element-of-set? x set)
      set
      (cons x set)))

(define (union-set s1 s2)
  (cond ((null? s1) s2)
        ((element-of-set? (car s1) s2)
         (union-set (cdr s1) s2))
        (else (cons (car s1)
                      (union-set (cdr s1) s2)))))
```

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union-set の両者の違いは

```
(define (union-set s1 s2)
  (cond ((null? s1) s2)
        ((element-of-set? (car s1) s2)
         (union-set (cdr s1) s2))
        (else (cons (car s1)
                      (union-set (cdr s1) s2)))))

(define (union-set s1 s2)
  (cond ((null? s1) s2)
        ((element-of-set? (car s1) s2)
         (union-set (cdr s1) s2))
        (else (union-set (cdr s1)
                          (cons (car s1) s2)))))

(union-set '(1 2 1) '(a b c))の結果は？
```

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集合のunordered list表現(続)

```
(define (intersection-set s1 s2)
  (cond ((or (null? s1) (null? s2)) ())
        ((element-of-set? (car s1) s2)
         (cons (car s1)
               (intersection-set
                (cdr s1) s2)))
        (else (intersection-set
                (cdr s1) s2))))
```

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集合手続きの計算量 (#set=n)

```
(define (element-of-set? x set)
  (cond ((null? set) false)
        ((equal? x (car set)) true)
        (else (element-of-set? x (cdr set)))))

(define (adjoin-set x set)
  (if (element-of-set? x set)
      set
      (cons x set)))

(define (union-set s1 s2)
  (cond ((null? s1) s2)
        ((element-of-set? (car s1) s2)
         (union-set (cdr s1) s2))
        (else (cons (car s1)
                      (union-set (cdr s1) s2)))))
```

$\Theta(n)$

$\Theta(n)$

#s1=n
#s2=m
 $\Theta(mn)$

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intersection-setの計算量

```
(define (intersection-set s1 s2)
  (cond ((or (null? s1) (null? s2)) ())
        ((element-of-set? (car s1) s2)
         (cons (car s1)
                (intersection-set
                 (cdr s1) s2)))
        (else (intersection-set
                (cdr s1) s2))))
```

計算のオーダーは $\#s1=m1, \#s2=m2$ とすると、

$\Theta(n^2)$ $n=\max\{m1,m2\}$ ($m1*m2$ のオーダー)

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集合(set)のOrdered List表現

```
(define (element-of-set? x set)
  (cond ((null? set) false)
        ((= x (car set)) true)
        ((< x (car set)) false)
        (else (element-of-set? x (cdr set)))))
```

$\Theta(n)$ 平均的には $n/2$

```
(define (adjoin-set x set)
  (cond ((null? set) (list x))
        ((= x (car set)) set)
        ((< x (car set)) (cons x set))
        (else (cons (car set)
                      (adjoin-set x (cdr set))))))
```

$\Theta(n)$ 平均的には $n/2$

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集合(set)のOrdered List表現

```
(define (union-set s1 s2)
  (if (null? s1)
      s2
      (let ((x1 (car s1)) (x2 (car s2)))
        (cond ((= x1 x2)
                 (cons x1
                       (union-set (cdr s1) (cdr s2))))
              ((< x1 x2)
                 (cons x1 (union-set (cdr s1) s2)))
              (else
                 (cons x2
                       (union-set s1 (cdr s2)))))))))
```

計算のオーダーは $\#s1=m1, \#s2=m2$ とすると、

$\Theta(n)$ $n=\max\{m1,m2\}$ ($m1+m2$ のオーダー)

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集合のunordered list表現(続)

```
(define (intersection-set s1 s2)
  (if (or (null? s1) (null? s2))
      ()
      (let ((x1 (car s1)) (x2 (car s2)))
        (cond ((= x1 x2)
                 (cons x1
                       (intersection-set (cdr s1) (cdr s2))))
              ((< x1 x2)
                 (intersection-set (cdr s1) s2))
              (else
                 (intersection-set s1 (cdr s2)))))))
```

計算のオーダーは $\#s1=m', \#s2=m$ とすると、

$\Theta(n)$ $n=\max\{m1,m2\}$ ($m+n$ のオーダー)

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集合の二進木(binary tree)表現

- リスト構造(木)で集合を表現
- 設計方針
 - 順序付きリストのように制御しないと、木の高さを h とすると、 $\Theta(h^2)$ の計算量がかかる
 - 左部分木のエンタリーはノードのそれより大きくない
 - 右部分木のエンタリーはノードのそれより大きい
- ノードの表現法
 - 次のリストでノードを表現
(エンタリー 左部分木 右部分木)



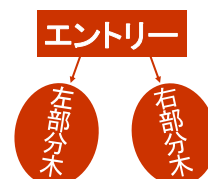
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二進木(binary tree)表現の実装

```
(define (entry tree) (car tree))
(define (left-branch tree) (cadr tree))
(define (right-branch tree)
  (caddr tree))

(define (make-tree entry left right)
  (list entry left right))
```

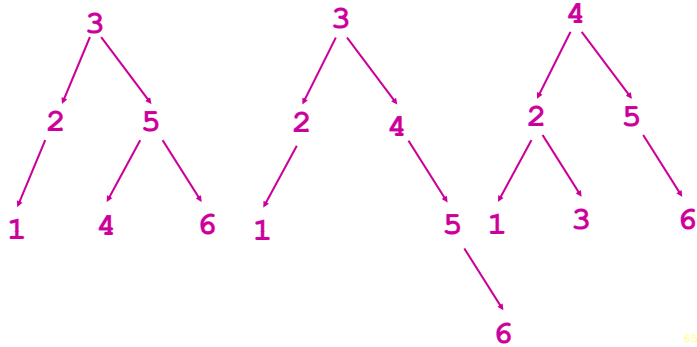


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二進木表現の曖昧性

集合{1, 2, 3, 4, 5, 6} の二進木表現



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集合(set)のbinary tree表現

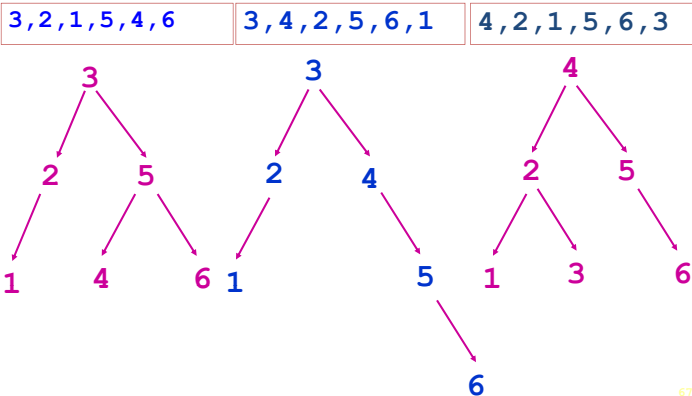
```
(define (element-of-set? x set)
  (cond ((null? set) false)
        ((= x (entry set)) true)
        ((< x (entry set))
         (element-of-set? x (left-branch set)))
        (else
         (element-of-set? x (right-branch set)))))

(define (adjoin-set x set)
  (cond ((null? set) (make-tree x () ()))
        ((= x (entry set)) set)
        ((< x (entry set))
         (make-tree (entry set)
                     (adjoin-set x (left-branch set))
                     (right-branch set)))
        (else
         (make-tree (entry set)
                     (left-branch set)
                     (adjoin-set x (right-branch set))))))
```

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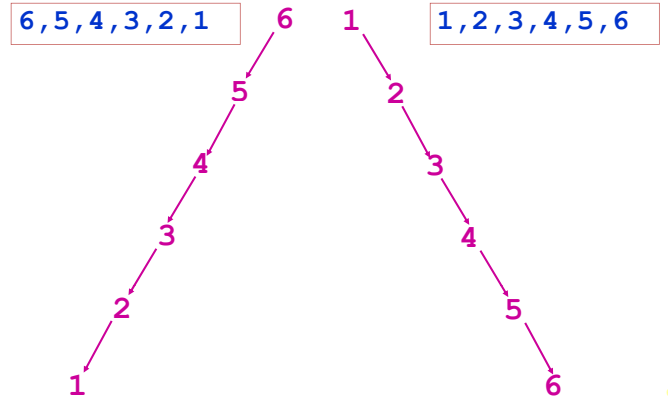
adjoin-set の動き



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adjoin-set の動き



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Tree⇒list 変換2種類

```
(define (tree->list-1 tree)
  (if (null? tree)
      ()
      (append (tree->list-1 (left-branch tree))
               (cons (entry tree)
                     (tree->list-1 (right-branch tree))))))

(define (tree->list-2 tree)
  (define (copy-to-list tree result-list)
    (if (null? tree)
        result-list
        (copy-to-list (left-branch tree)
                       (cons (entry tree)
                             (copy-to-list (right-branch tree)
                                             result-list)))))
  (copy-to-list tree '()) )
```

両者の違いは？
前順走査・間順走査・後順走査と走査順が違う(第2回)

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balanced binary tree表現

```
(define (list->tree elements)
  (car (partial-tree elements (length elements))))

(define (partial-tree elts n)
  (if (= n 0)
      (cons () elts)
      (let ((left-size (quotient (- n 1) 2)))
        (let ((left-result (partial-tree elts left-size)))
          (let ((left-tree (car left-result))
                (non-left-elts (cdr left-result))
                (right-size (- n (+ left-size 1))))
            (let ((this-entry (car non-left-elts))
                  (right-result (partial-tree
                                   (cdr non-left-elts)
                                   right-size)))
              (let ((right-tree (car right-result))
                    (remaining-elts (cdr right-result)))
                (cons (make-tree this-entry
                                  left-tree
                                  right-tree)
                      remaining-elts))))))))))
```

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balanced binary tree表現(改)

```
(define (list->tree elements)
  (car (partial-tree elements (length elements))))

(define (partial-tree elts n)
  (if (= n 0)
      (cons () elts)
      (let* ((left-size (quotient (- n 1) 2))
             (left-result (partial-tree elts left-size))
             (left-tree (car left-result))
             (non-left-elts (cdr left-result))
             (right-size (- n (+ left-size 1)))
             (this-entry (car non-left-elts))
             (right-result
              (partial-tree (cdr non-left-elts) right-size)))
            (right-tree (car right-result))
            (remaining-elts (cdr right-result)))
        (cons
         (make-tree this-entry left-tree right-tree)
         remaining-elts))))
```

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Sets & information retrieval

```
(define (lookup given-key set-of-records)
  (cond ((null? set-of-records) false)
        ((equal? given-key (key (car set-of-records)))
         (car set-of-records))
        (else (lookup given-key (cdr set-of-records)))))
```

連想リスト(a-list, associative list)

((<属性> . <値のリスト>)
(<attribute> . <value-list>)
...)

```
(define (assoc given-key set-of-records)
  (cond ((null? set-of-records) false)
        ((equal? given-key (caar set-of-records))
         (cdar set-of-records))
        (else (lookup given-key (cdr set-of-records)))))
```

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簡単な情報検索

```
(define (lookup given-key set-of-records)
  (cond ((null? set-of-records) false)
        ((equal? given-key (key (car set-of-records)))
         (car set-of-records))
        (else (lookup given-key (cdr set-of-records)))))

(define population
  '((China 1285.0 660.5 624.5)
    (India 1025.1 528.5 496.6)
    (USA 285.9 141.0 144.9)
    (Indonesia 214.8 107.8 107.1)
    (Brazil 172.6 85.2 87.4)
    (Pakistan 145.0 74.5 70.5)
    (Russia 144.7 67.7 77.0)
    (Bangladesh 140.4 72.3 68.0)
    (Japan 127.1 62.2 65.0)
    (Nigeria 116.9 59.0 58.0)
    (Mexico 100.4 49.6 50.7)))

(lookup 'Japan population)
(assoc 'Japan population) = (cdr (lookup 'Japan population))
```

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連想リスト(a-list, associative list)

((<属性> . <値のリスト>)
(<attribute> . <value-list>)
...)



key の順序

1. 数

1. 昇順(increasing order, ascending order) <
2. 降順(decreasing order, descending order) >

2. 辞書式順序(lexicographical order)

1. (string=? "PIE" "pie")
2. (string-ci=? "PIE" "pie")
3. string<?, string<=?, ...
4. char=? , char-ci=? , char>? , char>=? , ...

3. alphanumeric order

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ソーティングの応用

1. 本1冊に出てくる単語の頻度を求めよ。
2. Unix の pipe で処理
次の1行のコマンドでできる。
tr '\t,.;:]*' '\n' < file | 改行不可
tr '[A-Z]' '[a-z]' | sort | 改行不可
uniq -c | sort -r
3. www.gutenberg.org よりフルテキストを入手、
 - *Gulliver's Travel (Swift)*
the 2894, of 1844, and 1755, to 1557,
i 1311, a 1177, in 984, my 768, was 625
 - *TAO (Lao-Tsu)*
the 675, and 373, to 345, of 335, is 290
it 225, not 164, in 154, he 136, a 136

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宿題は、ありません。

中間試験は1.1.1~2.2.2

勉強をしっかりとください。



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