## Cookbook

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## Chapter 1

## Algebraic Algorithms

#### 1.1 Exponentiation by squaring

#### Problem 1.1.1.

Input

Given the operator  $\cdot$ , element a and positive integer n. Where a is an element of a semigroup under  $\cdot$ .

Output

Find  $a^n$ , where  $a^n = a \cdot a^{n-1}$ .

The general method to solve the problem is exponentiation by squaring. It is originally used for integer exponentiation, but any associate operator can be used in it's place. Here is a theorem stated in algebraic flavor.

**Theorem 1.1.1.** For any semigroup  $(S, \cdot)$ ,  $x \in S$  and  $n \in \mathbb{N}$ ,  $x^n$  can be computed with  $O(\log n)$  applications of  $\cdot$ .

*Proof.* Express n as binary  $c_k c_{k-1} \dots c_0$ , where  $c_i \in \{0,1\}$ . We make sure  $0 \cdot a$  is the treated as the identity, and  $1 \cdot a = a$  for all a. The following observations are crucial.

$$a^n = c_0 a^{2^0} \cdot c_1 a^{2^1} \cdot \dots \cdot c_k a^{2^k}$$
  
 $a^{2^{i+1}} = a^{2^i} \cdot a^{2^i}$ 

The code that compute  $a^n$  from the above two equalities.

```
import Data. Digits exponentiation By Squaring:: Integral a \Rightarrow (b \rightarrow b \rightarrow b) \rightarrow b \rightarrow a \rightarrow b exponentiation By Squaring op a n = foldr1 op \{y \mid (x,y) \leftarrow (zip\ binary\ twoPow), x \not\equiv 0\} where twoPow = a: zipWith\ op\ twoPow\ twoPow binary = digitsRev\ 2\ n
```

One can analyze the number of times the operator is used. The twoPow is the infinite list  $[a, a^2, \ldots, a^{2^i}, \ldots]$ . It takes k operations to generate the first k+1 elements. At most k additional operations are required to combine the result with the operator. Therefore the operator is used  $O(\log n)$  times.

This result can of course be extended to monoid and groups, so it work for all non-negative and integer exponents, respectively.

### 1.2 Linear homogeneous recurrence relations with constant coefficients

**Definition 1.2.1** (Linear homogeneous recurrence relations with constant coefficients). A linear homogeneous recurrence relations in ring R with constant coefficients of order k is a sequence with the following

recursive relation

$$a_n = \sum_{i=1}^k c_i a_{n-i}$$

, where  $c_i$  are constants.

We use linear recurrence relation to abbreviate.

The most common example is the Fibonacci sequence.  $F_0 = 0, F_1 = 1$  and  $F_n = F_{n-1} + F_{n-2}$  in the ring  $\mathbb{Z}$ . The Fibonacci sequence have a simple implementation. fibs = 0:1: zipWith (+) fibs (tail fibs). We want to generalize it.

#### 1.2.1 Lazy sequence

#### Problem 1.2.1.

#### Input

- 1. A list of coefficients  $[c_1, c_2, \ldots, c_n]$  of a linear recurrence relation.
- 2. A list of base cases  $[a_0, a_1, \ldots, a_{n-1}]$  of a linear recurrence relation.

#### Output

The sequence of values of the linear recurrence relation as a infinite list  $[a_0, a_1, \dots]$ 

Here is a specific implementation where we are working in the ring  $\mathbb{Z}$ .

```
import Data.List linearRecurrence :: Integral a \Rightarrow [a] \rightarrow [a] \rightarrow [a] linearRecurrence coef base = a where a = base + map (sum \circ (zipWith (*) coef)) (map (take n) (tails a)) <math>n = (length coef)
```

One can generalize it easily to any ring.

Having a infinite list allows simple manipulations. However, finding the nth element in the sequence cost O(nk) time. It becomes unreasonable if a person only need to know the nth element.

#### 1.2.2 Determine nth element in the index

If n is very large, a more common technique would be solve for  $a_n$  using matrix multiplication.

#### 1.2.3 Linear Recurrence in Finite Ring

Linear recurrence is perodic in finite rings. Therefore one might want to produce only the periodic part of the ring. [INSERT MORE ON THIS SUBJECT]

## 1.3 A particular kind of recurrence

A common recurrence has the form

$$a_n = \sum_{i=0}^{\infty} b_i a_{n-m_i}$$

, where  $m_i$  and  $b_i$  are both infinite sequences.  $m_i \in \mathbb{N}$ .  $a_{-i} = 0$  for all positive i. This is well defined as long as  $b_i, a_i$  are in the same ring.

#### Problem 1.3.1.

#### Input

Infinite sequence  $b_i$  and  $m_i, m_i \in \mathbb{N}$ . Finite sequence  $c_0, \ldots, c_k$ 

#### Output

The infinite sequence defined as

$$a_n = \begin{cases} \sum_{i=0}^{\infty} b_i a_{n-m_i} & \text{if } n > k \\ c_n & \text{if } n \leqslant k \end{cases}$$

One can use a balanced binary tree to store the entire infinite list, and the time to generate the nth element is  $O(d(n) \log n)$ , where d is the density function of  $\{m_i\}$ .

Using an array would make it O(d(n)), but it is too imperative for our taste, how about we only use list and achieve O(d(n)) time, elegantly?

The idea is that we are summing the first item of infinite many stacks. However we don't have to really sum the infinite stacks, we only sum the stack we require.

```
import Data.List
rec :: Num \ a \Rightarrow [a] \rightarrow [a] \rightarrow [Int] \rightarrow [a]
rec \ c \ b \ m = a

where a = c + rest
rest = next \ [] \ 0 \ m
next \ xs \ k \ (m : ms)
|k \equiv m = next \ (a : xs) \ k \ ms
|otherwise = val + next \ (map \ tail \ xs) \ (k + 1) \ (m : ms)
where val = \mathbf{if} \ (k < length \ c) \ \mathbf{then} \ [] \ \mathbf{else} \ [sum \ \$ \ zip With \ (*) \ (reverse \ (map \ head \ xs)) \ b]
```

#### 1.4 Canonical forms of a boolean function

One can always describe a boolean function f over n variables to a list of  $2^n$  boolean values, by mapping it into a function g.

$$f(x_n, \dots, x_1) = g(\sum_{i=1}^n 2^{i-1} x_i)$$

#### 1.4.1 Sum of minterms

#### Problem 1.4.1.

#### Input

A list of values of  $\{0,1\}$ , of length  $2^n$ .

#### Output

Find a function of the following form that also generate the same list.

$$\bigvee_{y \in Y} (\bigwedge_{x \in y} x)$$

Where each x is either  $x_i$  or  $\neg x_i$  for some i. Y can be described by a list of lists. Use i to denote  $x_i$  and -i to denote  $x_i$ .

#### 1.4.2 Product of maxterms

#### Problem 1.4.2.

#### Input

Input the same as the sum of minterms.

#### Output

Find a function of the following form that also generate the same list.

$$\bigwedge_{y \in Y} (\bigvee_{x \in y} x)$$

Output Y.

#### 1.4.3 Implementation

```
import Data.Digits

import Data.List

import Data.List.Utils

sumOfMinterms = snd \circ booleanCanonicalForm
productOfMaxterms = fst \circ booleanCanonicalForm
booleanCanonicalForm :: Integral \ a \Rightarrow [a] \rightarrow ([[a]], [[a]])
booleanCanonicalForm \ values = (snd \$ \ unzip \ pos, snd \$ \ unzip \ sop)
\mathbf{where} \ (pos, sop) = partition \ (\lambda(x, y). x \equiv 0) \ (zip \ values \ power)
power = map \ (terms \circ (replace \ [0] \ [-1]) \circ pad \circ digitsRev \ 2) \ [0 ..]
terms \ d = zipWith \ (*) \ d \ [1 ..]
pad \ a = a + replicate \ (n - (length \ a)) \ 0
n = floor \$ \ logBase \ 2 \ (fromIntegral \ (length \ values))
```

## Chapter 2

## Combinatorial Algorithms

#### 2.1 List of Lattice Points

#### Problem 2.1.1.

Input

Positive integer k.

Output

A infinite list that contain all nonnegative lattice points in k-th dimension.

```
nonNegative Lattice Points \ k = concat \ map \ (sum ToN \ k) \ [0..]

where sum ToN \ k \ n

\mid k \equiv 1 = [[n]]

\mid otherwise = concat \ [(map \ (i:) \ (sum ToN \ (k-1) \ (n-i))) \ \mid i \leftarrow [0..n]]
```

#### Problem 2.1.2.

Input

Positive integer k.

Output

A infinite list that contain all lattice points in k-th dimension.

To show an example, here is list of integers.

```
integers :: [Integer]
integers = (0:) \$ concat \$ zip With (\lambda x y. [x, y]) [1...] (map negate [1...])
```

One want a way to be able to list all elements in the k-th dimension.

### 2.2 Integer Partitions

**Definition 2.2.1** (Integer Partition). A integer partition of n is a multiset  $\{a_1, \ldots, a_k\}$ , such that  $\sum_{i=1}^k a_i = n$ 

**Definition 2.2.2** (Partition Numbers). The sequence of partition numbers  $\{p(n)\}$  is the number of integer partitions for n.

```
 \begin{array}{c} \textbf{Problem 2.2.1.} \\ \textbf{\textit{Input}} \\ \textbf{Integer } n. \\ \textbf{\textit{Output}} \end{array}
```

List of partitions of n.

To find all possible partition of a integer, we proceed with a simple recursive formula.

Let p(n, k) be the list of ways to partition integer n using integers less or equal to k. p(n, n) is the solution to our problem. It is implemented as part in the code.

```
integerPartitions :: Integral a \Rightarrow a \rightarrow [a]
integerPartitions n = part \ n \ n
where part \ 0 = [[]]
part \ n \ k = [(i:is) \mid i \leftarrow [1 ... min \ k \ n], is \leftarrow part \ (n-i) \ i]
```

#### Problem 2.2.2.

#### Input

None

#### Output

The infinite list of partition numbers.

Naively,  $0: map \ (length \circ integer Partitions) \ [1..]$  works well, except the time complexity is O(np(n)), and p(n) is exponential. A more well known approach, that only cost  $O(\sqrt{n})$  additional operations to generate the nth number, will be given instead.

Extend the definition of the partition number, such that p(0) = 1 and p(-n) = 0 for all positive integer n. The partition number p(n) has the relation

$$p(n) = \sum_{k=0}^{\infty} (-1)^k (p(n - p_{2k+1}) + p(n - p_{2k+2}))$$

where  $p_n$  is the sequence of generalized pentagonal number.

We have already developed the tools to work with this kind of recurrence in section 1.3.

```
generalizedPentagonalNumbers :: [Integer]

generalizedPentagonalNumbers = [(3*n \uparrow 2 - n) 'div' 2 \mid n \leftarrow integers]

partitionNumbers :: [Integer]

partitionNumbers = rec [1] (cycle [1, 1, -1, -1]) (tail generalizedPentagonalNumbers)
```

## 2.3 Find the primitive word in a free monoid

#### Problem 2.3.1.

#### Input

A word w in a free monid.

#### Output

A primitive word p, such that  $p^n = w$  for some integer n.

A word p is primitive if  $p = w^k$  implies k = 1. This will use the algorithm in [1]. [Nah, just KMP...]

## 2.4 Period of a eventually periodic sequence

#### Problem 2.4.1.

#### Input

- 1. A integer of the upper bound u of the period.
- 2. A infinite list that represent a eventually periodic sequence, such that if two finite sequence of length u are equal and the starting index is less than u apart, then they must be inside the periodic part of the sequence.

#### Output

A pair of the initial sequence and the periodic part.

The naive algorithm, for each finite sequence of length u, see if the second condition in the input holds, does pretty well if u is small. In fact  $O(nu^2)$  where n is the length of the aperiodic part.

```
import Data.List

import Data.Maybe

eventuallyPeriodic :: Eq \ a \Rightarrow [a] \rightarrow Int \rightarrow ([a],[a])

eventuallyPeriodic \ sequence \ bound = (ini, take \ period \ rep)

where table = map \ (take \ (bound + 1)) \ (tails \ (map \ (take \ bound) \ (tails \ sequence)))

exist = map \ (\lambda x. \ elemIndex \ (head \ x) \ (tail \ x)) \ table

period = 1 + (fromJust \ head \ just)

(no, just) = span \ isNothing \ exist

(ini, rep) = splitAt \ (length \ no) \ sequence
```

Of course it can be improved to O(nu) easily by using a smarter string search algorithm. Or even better, O(n).[Implement them later]

A variation of the problem could be the upper bound for length of the non-periodic part of the sequence is known.

# Bibliography

[1] Artur Czumaj and Leszek Gasieniec. On the complexity of determining the period of a string, 2000.