## GENOME-SCALE ALGORITHM DESIGN

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## Exercises for Chapter 2. Algorithm design

- 2.1 Consider the fail(·) function of the Morris-Pratt (MP) algorithm. We should devise a linear-time algorithm to compute it on the pattern to conclude the linear-time exact pattern matching algorithm. Show that one can modify the same MP algorithm so that on inputs  $P = p_1 p_2 \cdots p_m$  and  $T = p_2 p_3 \cdots p_m \#^m$ , where  $\#^m$  denotes a string of m concatenated endmarkers #, the values fail(2), fail(3), ..., fail(m) can be stored on the fly before they need to be accessed.
- 2.2 The Knuth–Morris–Pratt (KMP) algorithm is a variant of the MP algorithm with optimized fail(·) function: fail(i) = i', where i' is largest such that  $p_1p_2 \cdots p_{i'} = p_{i-i'+1}p_{i-i'+2} \cdots p_i$ , i' < i, and  $p_{i'+1} \neq p_{i+1}$ . This last condition makes the difference from the original definition. Assume you have the fail(·) function values computed with the original definition. Show how to update these values in linear time to satisfy the KMP optimization.
- 2.3 Generalize KMP for solving the multiple pattern matching problem, where one is given a set of patterns rather than only one as in the exact string matching problem. The goal is to scan T in linear time so as to find exact occurrences of any pattern in the given set. Hint. Store the patterns in a tree structure, so that common prefixes of patterns share the same subpath. Extend fail(·) to the positions of the paths in the tree. Observe that unlike in KMP, the running time of the approach depends on the alphabet size  $\sigma$ . Can you obtain scanning time  $O(n \log \sigma)$ ? Can you build the required tree data structure in  $O(M \log \sigma)$  time, where M is the total length of the patterns? On top of the  $O(n \log \sigma)$  time for scanning T, can you output all the occurrences of all patterns in linear time in the output size?
- 2.4 Show that a certificate for the Hamiltonian path problem can be checked in time O(n) (where n is the number of vertices) assuming an adjacency representation of the graph that uses  $O(n^2)$  bits. *Hint.* Use a table of n integers that counts the number of occurrences of the vertices in the given certificate.
- 2.5 Suppose that we can afford to use no more than O(m) space to represent the adjacency list. Show that a certificate for the Hamiltonian path can now be checked in time  $O(n \log n)$ .
- 2.6 Find out how bit-manipulation routines are implemented in your favorite programming language. We visualize below binary representations of integers with the most-significant bit first. You might find useful the following examples of these operations:
  - *left-shift*: 00000000101001 << 2 = 000000010100100,
  - *right-shift*: 000000010100100 >> 5 = 00000000000101,
  - *logical or*: 000000000101001 | 100000100001001 = 1000001000101001,

- exclusive or:  $00000000101001 \oplus 100000100001001 = 10000010001000000$ ,
- *complement*: ~000000000101001 = 111111111010110,
- addition: 000000000101001 + 000000000000000001 = 0000000001001010, and

These examples use 16-bit variables (note the overflow). Show two different ways to implement a function mask(B,d) that converts the *d* most significant bits of a variable to zero. For example, mask(10000010001001,7) = 000000000001001.

2.7 Implement with your favorite programming language a fixed-length bit-field array. For example, using C++ you can allocate with

## A=new unsigned[(n\*k)/w+1]

an array occupying roughly  $n \cdot k$  bits, where w is the size of the computer word (unsigned variable) in bits and k < w. You should provide operations setField(A,i,x) and x=getField(A,i) to store and retrieve integer x from A, for x whose binary representation occupies at most k bits.

- 2.8 Implement using the above fixed-length bit-field array an  $O(n \log n)$ -bit representation of a node-labeled static tree, supporting navigation from the root to the children.
- 2.9 Recall how stack, queue, and *deque* work. Implement them using your favorite programming language using doubly-linked lists.
- 2.10 Given an undirected graph G, a subset  $S \subseteq V(G)$  is called an *independent set* if no edge exists between the vertices of S. In the independent-set problem we are given an undirected graph G and an integer k and are asked whether G contains an independent set of size k. Show that the Independent set problem is NP-complete.
- 2.11 A Boolean formula  $f(x_1, \ldots, x_n)$  is in 3-CNF form if it can be written as

$$f(x_1,\ldots,x_n)=c_1\wedge\cdots\wedge c_m,$$

where each  $c_i$  is  $y_{i,1} \vee y_{i,2} \vee y_{i,3}$ , and each  $y_{i,j}$  equals  $x_k$  or  $\neg x_k$ , for some  $k \in \{1, \ldots, n\}$ (with  $y_{i,1}, y_{i,2}, y_{i,3}$  all distinct). The subformulas  $c_i$  are called *clauses*, and the subformulas  $y_{i,j}$  are called *literals*. The following problem, called 3-SAT, is known to be NP-complete. Given a Boolean formula  $f(x_1, \ldots, x_n)$  in 3-CNF form, decide whether there exist  $\alpha_1, \ldots, \alpha_n \in \{0, 1\}$  such that  $f(\alpha_1, \ldots, \alpha_n)$  is true (such values  $\alpha_i$  are called a *satisfying truth assignment*).

Consider as "new" problem the clique problem from Example 2.3. Show that clique is NP-complete by constructing a reduction from 3-SAT. *Hint.* Given a 3-CNF Boolean formula

$$f(x_1, \dots, x_n) = (y_{1,1} \lor y_{1,2} \lor y_{1,3}) \land \dots \land (y_{m,1} \lor y_{m,2} \lor y_{m,3}),$$

construct the graph  $G_f$  as follows (see Figure 1 for an example):

- for every  $y_{i,j}$ ,  $i \in \{1, ..., m\}$ ,  $j \in \{1, 2, 3\}$ , add a vertex  $y_{i,j}$  to  $G_f$ ;
- for every  $y_{i_1,j}$  and  $y_{i_2,k}$  with  $i_1 \neq i_2$  and  $y_{i_1,j} \neq \neg y_{i_1,k}$ , add the edge  $(y_{i_1,j}, y_{i_2,k})$ .

Show that f has a satisfying assignment if and only if  $G_f$  has a clique of size m.



Figure 1: A reduction of the 3-SAT problem to the clique problem. A clique in  $G_f$  is highlighted; this induces either one of the truth assignments  $(x_1, x_2, x_3) = (1, 1, 0)$  or  $(x_1, x_2, x_3) = (1, 1, 1)$ .

## Additional exercises not in the book

2.12 In Exercise 2.11 above we have reduced the "old" problem 3-SAT to the "new" problem clique. Devise an opposite reduction, that is, show that the clique problem can be reduced in polynomial time to the 3-SAT problem. *Hint.* Suppose we are given a graph G on n vertices  $v_1, \ldots, v_n$ , and we are asked whether G contains a clique with k vertices. For every vertex  $v_i$  and for every  $j \in \{1, \ldots, k\}$ , introduce a Boolean variable  $x_{i,j}$  with the meaning "vertex  $v_i$  is the jth vertex of the clique of size k". What is the corresponding Boolean formula on the variables  $x_{i,j}$ ?