

# Improved String Matching with k Mismatches

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Given a text string  $t_0 t_1 \dots t_{n-1}$ , a pattern string  $p_0 p_1 \dots p_{m-1}$  and an integer  $k$ ,  $k \leq m \leq n$ , we are interested in finding all occurrences of the pattern in the text with at most  $k$  mismatches, i.e. with at most  $k$  locations in which the pattern and the text have different symbols.

Recently, an efficient algorithm for such a problem has been devised by [2]. Its time performance is  $O(k(m \log m + n))$  and it uses  $O(k(m+n))$  space. Here we present a compact version of their algorithm, achieving a time performance of  $O(m \log m + kn)$  for general alphabets and of  $O(m+kn)$  for alphabets whose size is fixed. Our algorithm uses  $O(m)$  space. The data structure that we use is the *suffix tree* [1] of the pattern modified in order to support the *static lowest common ancestor* algorithm (LCA for short) given in [5]. In more recent versions of [2] the authors used the suffix tree for the problem of string matching with  $k$  differences [4] but not for the problem of string matching with  $k$  mismatches [3].

The *suffix tree*  $T$  of the string  $p_0 p_1 \dots p_{m-1}$  is a digital search tree of  $O(m)$  nodes containing all suffixes of that string. Each leaf of  $T$  is labeled with a distinct integer  $j$  so that the path from the root of  $T$  to leaf (labeled)  $j$  corresponds to suffix  $p_j p_{j+1} \dots p_{m-1}$ . A fast algorithm for the construction of  $T$  is reported in [1] and it takes  $O(m \log m)$  time for general alphabet. When the alphabet has a fixed size, it takes  $O(m)$ . The LCA algorithm is used to quickly find the length of the longest common prefix between suffixes  $p_i \dots p_{m-1}$  and  $p_j \dots p_{m-1}$ . Indeed, we assume that the query  $LCA(T, i, j)$  returns such a length. We recall that the LCA algorithm is linear in the number of queries [5]. The algorithm can be informally described as follows.

The algorithm tests, in increasing order, all positions of the text in order to locate occurrences of the pattern in the text with at most  $k$  mismatches. Let  $i_{new}$  be the current position to be tested and let  $A_{new}[1, k+1]$  be an array in which the (up to) first  $k+1$  mismatching text positions are stored. Namely,  $A_{new}[s] = r$  if  $t_r \neq p_{r-i_{new}}$  is the  $s$ -th mismatch between  $t_{i_{new}} \dots t_{i_{new}+m-1}$  and  $p_0 \dots p_{m-1}$ . Let  $i_{old} < i_{new}$  be such that (up to at most  $k+1$  mismatches)  $t_{i_{old}} \dots t_j = p_0 \dots p_{j-i_{old}}$ , with  $j$  maximal. Let  $A_{old}[1, k+1]$  be an array containing, in increasing order, the  $S$  mismatching positions between  $t_{i_{old}} \dots t_j$  and  $p_0 \dots p_{j-i_{old}}$ .  $A_{old}$  for  $i_{old}$  is as  $A_{new}$  for  $i_{new}$ .

In order to test an occurrence of  $p_0 \dots p_{m-1}$  at  $i_{new}$ , we first compare the string  $t_{i_{new}} \dots t_j$  with  $p_0 \dots p_{j-i_{new}}$  by using  $T$  (the suffix tree of the pattern) and the  $S$  positions in  $A_{old}$  (**Procedure MERGE**). Indeed, assume that the first  $q \leq k$  mismatches between  $t_{i_{new}} \dots t_j$  and  $p_0 \dots p_{j-i_{new}}$  have been found by using the first  $s-1 < S$  entries of  $A_{old}$ , i.e. it has been found that prefixes  $t_{i_{new}} \dots t_{i-1}$  and  $p_0 \dots p_{i-i_{new}-1}$  have  $q$  mismatching positions. Then,  $A_{old}[s]$  can be used to locate the  $q+1$ -st mismatch, i.e. the first mismatch between suffixes  $t_i \dots t_j$  and  $p_{i-i_{new}} \dots p_{j-i_{new}}$ . Let  $l = LCA(T, i-i_{new}, i-i_{old})$  and notice that  $i \leq A_{old}[s]$ . The following three cases may arise:

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1.  $i+l < A_{old}[s]$ . By noting that  $A_{old}[s]$  is the first mismatch between  $t_i \dots t_j$  and  $p_{i-i_{old}} \dots p_{j-i_{old}}$  and that  $p_{i-i_{new}+l} \neq p_{i-i_{old}+l}$  with  $p_{i-i_{new}} \dots p_{i-i_{new}+l-1} = p_{i-i_{old}} \dots p_{i-i_{old}+l-1}$ , we can conclude that  $t_{i+l} \neq p_{i-i_{new}+l}$ . Thus,  $i+l$  can be stored in  $A_{new}[q+1]$  and  $A_{old}[s]$  is still usable to detect mismatches (and we do not change  $s$ ).
2.  $i+l = A_{old}[s]$ . An analysis similar to (1) shows that  $t_{A_{old}[s]}$  must be compared with  $p_{i-i_{new}+l}$ .  $A_{old}[s]$  is stored in  $A_{new}[q+1]$  if there is a mismatch. In any case, we increment  $s$  ( $A_{old}[s]$  is useless from now on) and we continue looking for mismatches starting at  $i = A_{old}[s] + 1$ .
3.  $i+l > A_{old}[s]$ . An analysis similar to (1) and (2) shows that  $t_{A_{old}[s]} \neq p_{A_{old}[s]-i_{new}}$ . Thus,  $A_{old}[s]$  can be stored in  $A_{new}[q+1]$  and we increment  $s$  ( $A_{old}[s]$  is useless from now on).

Assume now that  $Q \leq k$  mismatches have been detected at the time  $A_{old}[s]$  becomes useless. If  $A_{old}[s] < j$ , we still have to compare  $t_{A_{old}[s]+1} \dots t_j$  with  $p_{A_{old}[s]-i_{new}+1} \dots p_{j-i_{new}}$ . Observing that  $t_{A_{old}[s]+1} \dots t_j$  matches a suffix of  $p_0 \dots p_{j-i_{old}}$ , this can be efficiently done by using the *suffix tree* and the *LCA* algorithm (second **while** loop in **Procedure MERGE**).

As soon as it is guaranteed that only  $Q \leq k$  mismatches exist between  $t_{i_{new}} \dots t_j$  and  $p_0 \dots p_{j-i_{new}}$ , it can be directly checked whether  $t_{j+1} \dots t_{i_{new}+m-1}$  and  $p_{j-i_{new}+1} \dots p_{m-1}$  have at most  $k-Q$  mismatching positions (**Procedure EXTEND**). In such a case  $i_{new}$  is an occurrence of the pattern in the text.

**Complexity:** It is easily seen that **Procedure EXTEND** scans each character of the text at most once contributing for  $O(n)$  time. On the other hand, **Procedure MERGE** takes time proportional to the size of  $A_{old} + A_{new}$ , that is at most  $2k+2$ . Since it can be called at most  $O(n)$  times, **Procedure MERGE** contributes for  $O(kn)$  time. The construction of the *suffix tree* takes  $O(m \log m)$  for general alphabets and  $O(m)$  for alphabets whose size is fixed [1]. Thus, the total time is, as claimed,  $O(m \log m + kn)$  for general alphabets and  $O(m + kn)$  for alphabets of fixed size. The space required by the algorithm is  $O(m+k) = O(m)$ , since the *suffix tree* requires  $O(m)$  space.

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**PROCEDURE MAIN****begin** $i_{old} = 0; j = 0; S = 0;$ **for**  $i_{new} = 0$  **to**  $n-m$  **do****begin** $q = 0;$  **if**  $i_{new} < j$  **then** **MERGE**( $i_{new}, i_{old}, j, S, q$ );**if**  $q < k+1$  **then** [**EXTEND**( $i_{new}, j, q$ );  $i_{old} = i_{new}; A_{old} = A_{new}; S = q;$ ]**if**  $q < k+1$  **then** **print**( $i_{new}, A_{old}$ ); $\{i_{new}$  is an occurrence of pattern in text; mismatching positions are in  $A_{old}\}$ **end****end** {MAIN}**PROCEDURE EXTEND**( $i_{new}, j, q$ )**begin****while** ( $q < k+1$ ) **and** ( $j - i_{new} < m$ ) **do****begin** $j = j+1;$  **if**  $t_j \neq p_{j-i_{new}}$  **then**  $q = q+1; A_{new}[q] = j;$ **end****end** {EXTEND}**PROCEDURE MERGE**( $i_{new}, i_{old}, j, S, q$ )**begin** $s = 1; i = i_{new};$ **while**  $i \leq A_{old}[S]$  **and**  $q \leq k$  **do****begin** $l = LCA(T, i - i_{new}, i - i_{old});$ **begin-case**1.  $i+l < A_{old}[s] :$   $q = q+1; A_{new}[q] = i+l; i = i+l+1;$ 2.  $i+l = A_{old}[s] :$  **if**  $t_{A_{old}[s]} \neq p_{i-i_{new}+l}$  **then** [ $q = q+1; A_{new}[q] = A_{old}[s];$   
 $i = A_{old}[s]+1; s = s+1;$ ]3.  $i+l > A_{old}[s] :$   $q = q+1; A_{new}[q] = A_{old}[s]; i = A_{old}[s]+1; s = s+1;$ **end-case****end****while**  $q \leq k$  **do****begin** $l = LCA(T, i - i_{new}, i - i_{old})$ **if**  $i+l \leq j$  **then**  $q = q+1; A_{new}[q] = i+l; i = i+l+1;$ **else return****end****end** {MERGE}