Fast Full Permutated Pattern Matching Algorithms on Multi-track Strings

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1 Introduction

The pattern matching problem on strings is to find all occurrences of a pattern string in a text string. Pattern matching algorithms such as the Knuth-Morris-Pratt (KMP) algorithm [8], Boyer-Moore algorithm [2], and Horspool algorithm [5], perform pattern matching fast by preprocessing the pattern. On the other hand, pattern matching can be also performed by preprocessing the text into some data structure such as a suffix tree [12], a suffix array [10], and a position heap [4].

The permuted pattern matching problem, proposed by Katsura et al. [6,7], is a generalization of the pattern matching problem, where we compare tuples of strings. Tuples of strings can model various types of real data such as multiple-sensor data, polyphonic music data, and multiple genomes. We call a tuple of strings of the same length a multi-track string. The permuted pattern matching problem is, given two multi-track strings \( T = (t_1, t_2, \ldots, t_N) \) and \( P = (p_1, p_2, \ldots, p_N) \) such that \( |p_1| = \cdots = |p_N| \leq |t_1| = \cdots = |t_N| \), to find all positions \( i \) such that \( P = (t_{r_1}[i : i + m - 1], \ldots, t_{r_N}[i : i + m - 1]) \) for some permutation \((r_1, \ldots, r_N)\) of \((1, \ldots, N)\), where \( m = |p_1| \) and \( t[i : j] \) denotes the substring of \( t \) from position \( i \) to \( j \). We propose new algorithms that perform full permuted pattern matching practically fast. The first and second algorithms are based on the Boyer-Moore algorithm and the Horspool algorithm, respectively. The third algorithm is based on the Aho-Corasick algorithm where we use a multi-track character instead of a single character in the so-called goto function. The fourth algorithm is an improvement of the multi-track Knuth-Morris-Pratt algorithm that uses an automaton instead of the failure function of the original algorithm. Our experiment results demonstrate that those algorithms perform permuted pattern matching faster than existing algorithms.

Keywords: permuted pattern matching, multi-track string, Boyer-Moore algorithm, Horspool algorithm, AC-automaton
new algorithms that perform full permuted pattern matching practically fast. The first algorithm, **MT-BM**, is based on the Boyer-Moore algorithm [2], and the second one, **MT-H**, is based on the Horspool algorithm [5], on which we made a significant improvement by using a data structure called track trie. The third algorithm, **multi-track AC-automaton**, is an algorithm for dictionary matching on multi-track strings based on the AC-algorithm [1], where we use a multi-track character instead of a single character in the so-called goto function. The fourth algorithm, **multi-track permuted matching automaton**, is an improvement of multi-track KMP algorithm [3] that uses an automaton instead of the failure function in the KMP algorithm. Moreover, we conduct experiments and show that our algorithms perform permuted pattern matching faster than existing algorithms. The worst case running time of proposed algorithms and existing algorithms are summarized in Table 1, where $d$ is the total length of the patterns and $\sigma$ is the size of the alphabet.

<table>
<thead>
<tr>
<th>Algorithm</th>
<th>Preprocessing time</th>
<th>Matching time</th>
<th>Online</th>
</tr>
</thead>
<tbody>
<tr>
<td>AC-automaton based [2]</td>
<td>$O(mM \log \sigma)$</td>
<td>$O(nN \log \sigma)$</td>
<td>yes</td>
</tr>
<tr>
<td>Multi-track KMP* [3]</td>
<td>$O(mM)$</td>
<td>$O(nN)\log \sigma$</td>
<td>no</td>
</tr>
<tr>
<td>Filter-MTKMP [3]</td>
<td>$O(m(M + \sigma))$</td>
<td>$O(n(mN + \sigma))$</td>
<td>yes</td>
</tr>
<tr>
<td>MT-BM*</td>
<td>$O(m(M \log \sigma + \sigma))$</td>
<td>$O(nN(m + \log \sigma) + n(N + \sigma))$</td>
<td>yes</td>
</tr>
<tr>
<td>MT-H*</td>
<td>$O(m(M \log \sigma + \sigma))$</td>
<td>$O(nN(m + \log \sigma) + n(N + \sigma))$</td>
<td>yes</td>
</tr>
<tr>
<td>MT AC-automaton*</td>
<td>$O(dM \log \sigma)$</td>
<td>$O(nN \log \sigma)$</td>
<td>no</td>
</tr>
<tr>
<td>MT permuted matching automaton*</td>
<td>$O(mM \log \sigma)$</td>
<td>$O(nN \log \sigma)$</td>
<td>yes</td>
</tr>
</tbody>
</table>

Table 1. Comparison of the algorithms for permuted pattern matching. Multi-track AC-automaton can find occurrences of multiple patterns. Algorithms with an asterisk are for full permuted pattern matching ($M = N$).

2 Preliminaries

Let $w \in \Sigma^n$ be a string of length $n$ over an alphabet $\Sigma$ and $\sigma = |\Sigma|$ be the alphabet size. The length $n$ of $w$ is denoted by $|w|$. The empty string, denoted by $\varepsilon$, is a string of length 0. By $w[i]$ we denote the $i$-th character of $w$ for $i \in \{1, \ldots , n\}$. The substring of $w$ that begins at position $i$ and ends at position $j$ is denoted by $w[i : j]$ for $1 \leq i \leq j \leq |w|$. We abbreviate $w[1 : i]$ to $w[i]$ and $w[i : n]$ to $w[i]$, which are called a prefix and a suffix of $w$, respectively. The reverse string of $w$ is denoted by $w^R$: that is, $w^R = w[n]w[n-1] \ldots w[2]w[1]$. For two strings $x$ and $y$, we denote by $x \prec y$ that $x$ is lexicographically smaller than $y$, and by $x \preceq y$ that either $x = y$ or $x < y$.

A multi-track string (or multi-track for short) $W = (w_1, w_2, \ldots , w_N)$ is an $N$-tuple of strings $w_i \in \Sigma^n$, and each $w_i$ is called the $i$-th track of $W$. A multi-track character $C = (c_1, c_2, \ldots , c_N)$ is an $N$-tuple of characters $c_i \in \Sigma$. The length $n$ of strings in $W$ is called the length of $W$ and denoted by $|W|_{\text{en}}$. The number $N$ of tracks in $W$ is called the track count of $W$ and denoted by $|W|_{\text{num}}$. The multi-track character $(w_1[i], w_2[i], \ldots , w_N[i])$ is denoted by $W[i]$ and the multi-track $W[i : j]$ is $(w_1[i : j], w_2[i : j], \ldots , w_N[i : j])$ for $1 \leq i \leq j \leq |W|_{\text{en}}$. Similarly to the notation for strings, $W[i : j]$ and $W[i : j]$ mean $W[1 : i]$ and $W[i : j]$ mean $W[i : j]$ and called a prefix and a suffix of $W$, respectively. Moreover, $W[i][j]$ denotes $w_j[i]$.

Let $r = (r_1, r_2, \ldots , r_N)$ be a permutation of $(1, 2, \ldots , N)$. For a multi-track $W = (w_1, w_2, \ldots , w_N)$, $W(r) = W(r_1, r_2, \ldots , r_N) = (w_{r_1}, \ldots , w_{r_N})$ is called a permuted multi-track of $W$. The sorted index $SI(W)$ of a multi-track $W$ is a permutation.
(r_1, \ldots, r_N) such that w_{r_i} \leq w_{r_{i+1}} for any 1 \leq i < N, where we assume r_i < r_{i+1} in the case w_{r_i} = w_{r_{i+1}}. The sorted multi-track sort(\mathcal{W}) is defined as \mathcal{W}(SI(\mathcal{W})). The reverse of a multi-track \mathcal{W} = (w_1, \ldots, w_N) is \mathcal{W}^R = (w^R_1, \ldots, w^R_N). The sorted index of the reverse multi-track, denoted by RI(\mathcal{W}), is a permutation (r_1, \ldots, r_N) such that w^R_{r_i} \leq w^R_{r_{i+1}} for any 1 \leq i < N. Note that SI(\mathcal{W}[i:]) and RI(\mathcal{W}: i) for 1 \leq i \leq n can be computed in O(nN\log \sigma) time offline by using a suffix tree [6] or a suffix array [9], and RI(\mathcal{W}: i) for 1 \leq i \leq n can be computed in O(n(N + \sigma)) time online by using radix sort.

For two multi-tracks \mathcal{X} = (x_1, x_2, \ldots, x_N) and \mathcal{Y} = (y_1, y_2, \ldots, y_N), \mathcal{X} permuted-matches \mathcal{Y}, denoted by \mathcal{X} \equiv \mathcal{Y}, if \mathcal{X} = \mathcal{Y}(r) for some permutation \mathbf{r}.

Throughout the paper, we assume that \mathcal{P} is a pattern with |\mathcal{P}|_{\text{num}} = M and |\mathcal{P}|_{\text{len}} = m, and \mathbf{T} is a text with |\mathbf{T}|_{\text{num}} = N = M and |\mathbf{T}|_{\text{len}} = n \geq m. The pattern matching problem on multi-tracks is defined as follows.

**Definition 1 (Full permuted pattern matching).** Given a multi-track text \mathbf{T} and a multi-track pattern \mathcal{P}, compute all positions \mathbf{i} that satisfy \mathcal{P} \equiv \mathbf{T}[i : i + m - 1].

For example, given a text \mathbf{T} = \begin{pmatrix} abaaaaa \\ abaabbaa \\ baababab \end{pmatrix} and a pattern \mathcal{P} = \begin{pmatrix} aba \\ baa \\ aaa \end{pmatrix}, we can see that the pattern matches at \mathbf{T}[2 : 4] = \mathcal{P}. Moreover, the pattern permuted matches with \mathbf{T}[6 : 8], since \mathcal{P}(3, 2, 1) = \begin{pmatrix} baa \\ aba \end{pmatrix} = \mathbf{T}[6 : 8]. Therefore, we should output \{2, 6\} in this case.

We remark that Katsura et al. defined a more general problem, where we have |\mathbf{T}|_{\text{num}} = N \geq |\mathcal{P}|_{\text{num}} = M and our task is to find a subsequence (r_1, \ldots, r_M) of (1, \ldots, N) and a position \mathbf{i} for which \mathcal{P} \equiv \mathbf{T}(r_1, \ldots, r_M)[i : i + m - 1] holds.

### 3 Boyer-Moore and Horspool algorithms for multi-track strings

In this section, we propose two permuted pattern matching algorithms that are based on the Boyer-Moore algorithm and the Horspool algorithm, which we call MT-BM and MT-H, respectively.

#### 3.1 Multi-track Boyer-Moore algorithm

The original Boyer-Moore algorithm uses two failure functions GS (good suffixes) and BC (bad characters) to determine how much the position of a substring to compare should be shifted when a mismatch is found between the input pattern and the substring of the text. Those functions are defined as follows on multi-tracks.

**Definition 2 (Suffixes).** For a multi-track \mathcal{P} of length |\mathcal{P}|_{\text{len}} = m, \text{suf}[i] is the maximum value of \mathbf{l} such that \mathcal{P}[i - \mathbf{l} + 1 : i] \equiv \mathcal{P}[\mathbf{m} - \mathbf{l} + 1 : \mathbf{m}] for 1 \leq i \leq \mathbf{m}.

**Definition 3 (Good suffixes).** For multi-track \mathcal{P} of length |\mathcal{P}|_{\text{len}} = m, GS[m] = 1 and GS[i] = \min A for 0 \leq i < \mathbf{m}, where

\[
A = \begin{cases} 0 < s < i & | \mathcal{P}[i - s + 1 : m - s] \equiv \mathcal{P}[i + 1 : m], \mathcal{P}[i - s : m - s] \nRightarrow \mathcal{P}[i : m] \} \\
\cup \{ i \leq s < m & | \mathcal{P}[1 : m - s] \equiv \mathcal{P}[s + 1 : m] \} \cup \{m\}. \end{cases}
\]
Algorithm 1: MT-BM and MT-H preprocessing functions

Function ComputeSuf($\mathcal{P}$)
1. compute $RI(\mathcal{P}; i)$ for $1 \leq i \leq m$;
2. $suf[m] \leftarrow m, j \leftarrow m, k \leftarrow m$;
3. for $i \leftarrow m - 1$ to $1$ do
4.     if $i > k$ and $suf[m - (j - i)] < i - k$ then $suf[i] \leftarrow suf[m - (j - i)]$;
5.     else
6.         if $i < k$ then $k \leftarrow i$;
7.         $j \leftarrow i$;
8.         while $k > 0$ and $\mathcal{P}[i](RI(\mathcal{P}; j)) = \mathcal{P}[k + m - j](RI(\mathcal{P}; m))$ do $k \leftarrow k - 1$;
9.     $suf[i] \leftarrow j - k$;
10. return $suf$;

Function ComputeGS($\mathcal{P}$)
11. $suf \leftarrow$ ComputeSuf($\mathcal{P}$);
12. for $i \leftarrow 1$ to $m$ do $GS[i] \leftarrow m$;
13. $j \leftarrow 1$;
14. for $i \leftarrow m$ to $1$ do
15.     if $suf[i] = i$ then
16.         while $j \leq m - i$ do
17.             if $GS[j] = m$ then $GS[j] \leftarrow m - i$;
18.             $j \leftarrow j + 1$;
19.     for $i \leftarrow 1$ to $m - 1$ do $GS[m - suf[i]] \leftarrow m - i$;
20. return $GS$;

Function ComputeBC($\mathcal{P}$)
21. compute $RI(\mathcal{P}; i)$ for $1 \leq i \leq m$;
22. for $i \leftarrow 1$ to $m - 1$ do
23.     if $BC(\mathcal{P}[i](RI(\mathcal{P}; i))) = m$ then $BC.\text{add}(\mathcal{P}[i](RI(\mathcal{P}; i)), m - i)$;
24. else $BC(\mathcal{P}[i](RI(\mathcal{P}; i))) \leftarrow m - i$;
25. return $BC$;

Algorithm 2: MT-BM

Input: Multi-track $\mathcal{T}$, Multi-track $\mathcal{P}$
Output: match positions
1. compute $RI(\mathcal{T}; i)$ for $1 \leq i \leq n$;
2. compute $RI(\mathcal{P}; i)$ for $1 \leq i \leq m$;
3. $BC \leftarrow$ ComputeBC($\mathcal{P}$);
4. $GS \leftarrow$ ComputeGS($\mathcal{P}$);
5. $j \leftarrow 0$;
6. while $j \leq n - m + 1$ do
7.     $i \leftarrow m$;
8.     while $i > 0$ and $\mathcal{T}[i + j](RI(\mathcal{T}; j + m)) = \mathcal{P}[i](RI(\mathcal{P}; m))$ do $i \leftarrow i - 1$;
9.     if $i \leq 0$ then
10.        output $j + 1$;
11.        $j \leftarrow j + GS[0]$;
12. else $j \leftarrow j + \max(GS[i], BC(\mathcal{T}[i + j](RI(\mathcal{T}; i + j)))) - (m - i)$;

Definition 4 (Bad character). For multi-track $\mathcal{P}$ of length $|\mathcal{P}|_{en} = m$ and a multi-track character $\mathbb{C}$, $BC(\mathbb{C})$ is the first occurrence position of sort($\mathbb{C}$) in $\mathcal{P}_{R[2]}$. The function $BC(\mathbb{C})$ returns $m$ if there is no occurrence of sort($\mathbb{C}$) in $\mathcal{P}_{R[2]}$. 
Algorithm 3: MT-H

\begin{itemize}
\item **Input:** Multi-track \( T \), Multi-track \( P \)
\item **Output:** match positions
\end{itemize}

1. compute \( RI(T[:i]) \) for \( 1 \leq i \leq n \);
2. compute \( RI(P[:i]) \) for \( 1 \leq i \leq m \);
3. \( BC \leftarrow \text{ComputeBC}(P) \);
4. \( j \leftarrow 0 \);
5. \textbf{while} \( j \leq n - m + 1 \) \textbf{do}
   \begin{itemize}
   \item \( i \leftarrow m \);
   \item \textbf{while} \( i > 0 \) and \( T[i+j](RI(T[:j+m])) = P[i](RI(P[:m])) \) \textbf{do} \( i \leftarrow i - 1 \);
   \item \textbf{if} \( i \leq 0 \) \textbf{then output} \( j+1 \);
   \item \textbf{else} \( j \leftarrow j + BC(T[j+m](RI(T[:j+m]))) \);
   \end{itemize}

In the implementation, \( suf \) and \( GS \) can be represented as arrays, while \( BC \) can be realized in a trie of the multi-track characters. We perform permuted-match instead of exact match when computing \( GS \). Algorithm 1 shows how to construct \( GS \) and \( BC \). The array \( GS \) is computed by \( \text{ComputeGS} \), which uses array \( suf \) computed by \( \text{ComputeSuf} \). Note that we compute \( RI \) at the beginning (Lines 2 and 24) of the algorithm and will not recompute them when we use the values later.

**Lemma 5.** The function \( \text{ComputeSuf} \) computes the array \( suf \) in \( O(m(M + \sigma)) \) time.

**Proof.** First, \( RI(P[:i]) \) can be computed in \( O(m(M + \sigma)) \) time by using radix sort. The for loop is executed \( m - 1 \) times and the while loop at line 9 is executed at most \( m \) times through the whole run, because \( k \) is always reduced in each loop. Comparison of two multi-track characters of the pattern that executed in each loop can be computed in \( O(M) \) time. \( \square \)

**Lemma 6.** The function \( \text{ComputeGS} \) computes \( GS \) in \( O(m) \) time.

**Proof.** All the for loops are executed at most \( m \) times. The while loop is executed at most \( m \) times through the whole execution of the algorithm, since \( j \) is always increased and does not exceed \( m \). \( \square \)

**Lemma 7.** The function \( \text{ComputeBC} \) computes \( BC \) in \( O(m(M \log \sigma + \sigma)) \) time.

**Proof.** \( RI(P[:i]) \) can be computed in \( O(m(M + \sigma)) \) time by using radix sort. Each edge in the trie of \( BC \) can be accessed in \( O(\log \sigma) \) time by using binary search. Since the depth of the trie is at most \( M \), each \( BC(P[i]) \) for \( 1 \leq i \leq m \) can be added and accessed in \( O(M \log \sigma) \) time. \( \square \)

By using both \( GS \) and \( BC \), MT-BM outputs the positions of the text that are permuted-matched with the pattern. The matching algorithm of MT-BM is shown in Algorithm 2.

**Theorem 8.** Given a multi-track text \( T \) and a pattern \( P \), MT-BM outputs the positions of the text that permuted-match with the pattern online in \( O(nN(m + \log \sigma) + n(N + \sigma)) \) time in the worst case with \( O(m(M \log \sigma + \sigma)) \) time preprocessing.

**Proof.** From Lemmas 5, 6 and 7, Algorithm 2 needs \( O(m(M \log \sigma + \sigma)) \) time for preprocessing. Next, \( RI(T[:i]) \) can be computed in \( O(n(N + \sigma)) \) time by using radix sort. In the outer while loop starting at line 9, the value of \( j \) is increased by at least 1,
Algorithm 4: Track-trie construction algorithm (constructTrackTrie(P))

1. **Input:** Multi-track P
2. **Output:** trackTrie
3. **Algorithm:**
   1. newNode ← rootNode;
   2. weight(rootNode) ← M;
   3. for i ← 1 to M do
      1. activeNode ← rootNode;
      2. for j ← m to 1 do
         1. if goto(activeNode, P[j][i]) = Null then
            1. newNode ← newNode + 1;
            2. weight(newNode) ← 1;
            3. goto(activeNode, P[j][i]) ← newNode;
            4. activeNode ← newNode;
         2. else
            1. activeNode ← goto(activeNode, P[j][i]);
            2. weight(activeNode) ← weight(activeNode) + 1;

Algorithm 5: Track-trie matching algorithm (matchTrackTrie(T, j))

1. **Input:** Multi-track T, index j, trackTrie
2. **Output:** mismatch position
3. **Algorithm:**
   1. activeNode[k] ← rootNode for 1 ≤ k ≤ M;
   2. temp(node) ← 0 for all node in trackTrie;
   3. for i ← m to 1 do
      1. for k ← 1 to M do
         1. if goto(activeNodes, T[i + j][k]) = Null then return i;
         2. else
            1. activeNodes[k] ← goto(activeNodes[k], T[i + j][k]);
            2. temp(activeNodes[k]) ← temp(activeNodes[k]) + 1;
            3. if temp(activeNodes[k]) > weight(activeNodes[k]) then return i;
   4. return 0;

so the loop is executed at most \( n - m + 2 \) times. In each execution of the outer loop, the inner while loop is executed at most \( m \) times, where multi-track characters of the pattern and the text can be compared in \( O(N) \) time. BC can be accessed in \( O(N \log \sigma) \) time and GS can be executed in \( O(1) \) time.

3.2 Multi-track Horspool algorithm

MT-H in Algorithm 3 uses BC to shift the pattern that can be computed in the same way as BC of MT-BM shown in Algorithm 1.

**Theorem 9.** Given a multi-track text T and a pattern P, MT-H outputs the positions of the text that are permuted-matched with the pattern in \( O(nN(m + \log \sigma) + n(N + \sigma)) \) time in the worst case with \( O(m(M \log \sigma + \sigma)) \) time preprocessing.

**Proof.** Similar to the proof of Theorem 8 beside MT-H uses BC only.

3.3 Boyer-Moore and Horspool matching algorithms with track-trie

The two algorithms presented in the previous subsections decide if two multi-tracks permuted-match by sorting them. In this subsection, we present another idea for this
task using a data structure called a track trie. The track trie of a multi-track $P$ stores all the reversed strings of the tracks of $P$, that is, $\{p^R_1, p^R_2, \ldots, p^R_M\}$. Fig. 1(a) shows the track trie of a multi-track pattern $P = (\text{aaabb}, \text{abbbba}, \text{bbaba})$.

Algorithm 4 is the construction algorithm for the track-trie of $P$. For a node $s$ of the track trie and a character $c \in \Sigma$, the goto function $\text{goto}(s, c)$ returns the child of $s$ that has an edge labeled $c$. We naturally extend it to the domain $\Sigma^*$ by $\text{goto}(s, \varepsilon) = s$ and $\text{goto}(s, aw) = \text{goto}(\text{goto}(s, a), w)$ for any $a \in \Sigma$ and $w \in \Sigma^*$. We also associate a weight with each node to find mismatch on a text, as we will explain later.

**Theorem 10.** Algorithm 4 constructs the track-trie of $P$ in $O(mM \log \sigma)$ time.

**Proof.** The function $\text{goto}$ can be calculated in $O(\log \sigma)$ time by binary search. On each execution of the inner for loop (line 5), Algorithm 4 executes $\text{goto}$ to check child nodes of activeNode. If there is no node with an edge labeled $P[j][i]$, then a new node is constructed, which can be done in $O(1)$ time. On the other hand, if there is a node with an edge labeled $P[j][i]$, Algorithm 4 accesses the child node and then increases its weight by one. The total number of iterations of the inner loop is $mM$. $\square$

For a given multi-track text $T$ and a position $i$, Algorithm 5 finds a mismatch position in two cases: (1) when a track cannot find its $\text{goto}$ destination, and (2) when the number of tracks that have the same string $w$ is more than the weight of the node that represents the string $\text{goto}(\text{root}, w)$. Those mismatch conditions are illustrated in Fig. 1(b) and (c), respectively. Fig. 1(b) shows that the track trie cannot find a transition for the second character $b$ of the third track. On the other hand, Fig. 1(c) shows that $T_2[3:]$ has two ‘bbba’ on its track, however the $P[3:]$ has only one ‘bbba’ on its track, i.e. the node that represents ‘bbba’ has one on its weight.

**Theorem 11.** Given a multi-track text $T$ and a position $j$, Algorithm 5 finds a mismatch position in the pattern in $O(mM \log \sigma)$ time.

**Proof.** For each position $i+j$ on the text, Algorithm 5 executes $\text{goto}$ to check whether activeNodes[$k$] has a child node with an edge labeled $T[i+j][k]$ for $1 \leq k \leq M$. If there is no child node with an edge labeled $T[i+j][k]$, then Algorithm 5 considers it as mismatch and returns the mismatch position. On the other hand, if there is such a child node, Algorithm 5 changes activeNodes[$k$] to the child node, and then check whether the number of tracks of $T[i+j:]$ that contain $T[k][i+j:i+m]$ as a prefix is more than the weight of the child node. If the number of tracks exceeds the weight, then Algorithm 5 treats it as mismatch and returns the mismatch position. The total number of iterations of the inner loop is at most $mM$. $\square$
Figure 2. Multi-track AC-automaton of $D = \{ P_1, P_2, P_3 \}$, where $P_1 = (aaabb, abaab, bbaaa)$, $P_2 = (abab, abba, bbab)$, and $P_3 = (aabbab, bababb, baaaab)$. The asterisk '*' is a special character that matches with any characters in $\Sigma$.

Algorithm 6: Multi-track AC-automaton goto function and initial output function construction algorithm

Input: Set of multi-track patterns $D = \{ P_1, P_2, ..., P_r \}$

Output: Goto function and initial output function

1. compute $SI(P_i[j])$ for $1 \leq i \leq r$ and $1 \leq j \leq m_i$;
2. create states $\text{rootState}$ and $\bot$;
3. $\text{goto}((\bot, W)) \leftarrow \text{rootState}$ for all multi-track character $W \in \Sigma^M$;
4. $\text{newState} \leftarrow \text{rootState}$;
5. for $i \leftarrow 1$ to $r$ do
   6. $\text{activeState} \leftarrow \text{rootState}$;
   7. for $1 \leq j \leq m_i$ do
      8. if $\text{goto}(\text{activeState}, P_i[j](SI(P_i[1:]))) \neq \text{fail}$ then
         9. $\text{activeState} \leftarrow \text{goto}(\text{activeState}, P_i[j](SI(P_i[1:])))$;
      else
         10. $\text{newState} \leftarrow \text{newState} + 1$;
         11. $\text{goto}(\text{activeState}, P_i[j](SI(P_i[1:]))) \leftarrow \text{newState}$;
         12. $\text{label}(\text{newState}) \leftarrow i$;
         13. $\text{activeState} \leftarrow \text{newState}$;
   14. if $k = m_i$ then
      15. $\text{output}(\text{activeState}) \leftarrow \text{output}(\text{activeState}) \cup \{ P_i \}$;

Although the worst case time complexity remains the same, by using track-trie, both MT-BM and MT-H can match the pattern to the text practically faster, because we do not need to compute the reverse sorted index of the text. First, we construct the track-trie of the pattern by using $\text{constructTrackTrie}(P)$. Then, we replace line 9 (resp. line 7) of Algorithm 2 (resp. Algorithm 3) by $\text{matchTrackTrie}(T, j)$ to find a mismatch position.

4 Multi-track AC-automaton

In this section, we will explain a data structure called a multi-track AC-automaton that can perform dictionary matching on multi-tracks. Given a set $D = \{ P_1, P_2, ..., P_r \}$ of multi-track patterns called a dictionary and a multi-track text $T$, by preprocessing the patterns, the multi-track AC-automaton can find all occurrence positions of each pattern in the text. Let $d = \sum_{i=1}^{r} m_i$ be the total length of the patterns in $D$, where...
Algorithm 7: Multi-track AC-automaton failure function and output function construction algorithm.

**Input:** Goto function and initial output function  
**Output:** Failure and output functions

1. compute $SI(P_i[j:])$ for $1 \leq i \leq r$ and $1 \leq j \leq m_i$;
2. $\text{failure}(\text{rootState}) \leftarrow \bot$;
3. push rootState to queue;
4. while $q \neq \text{empty}$ do
   5. pop activeState from queue;
   6. for $a$ such that goto(activeState, $a$) = $s \neq \text{fail}$ do
      7. push $s$ to queue;
      8. state $\leftarrow \text{failure}(\text{activeState})$;
      9. $j \leftarrow \text{label}(s)$;
      10. while goto(state, $P_j[\text{depth}(s)](SI(P_i[\text{depth}(s) - \text{depth(state)}:]))) = \text{fail}$ do
          11. state $\leftarrow \text{failure}(\text{state})$;
      12. $\text{failure}(s) \leftarrow \text{goto}(\text{state}, P_j[\text{depth}(s)](SI(P_i[\text{depth}(s) - \text{depth(state)}:])))$;
      13. output$(s) \leftarrow \text{output}(s) \cup \text{output}($failure$(s)$);

Algorithm 8: multi-track AC-automaton matching algorithm

**Input:** Goto, failure and output functions  
**Output:** Set of (pattern,position) tuple \{($P_{k_1}, pos_1), (P_{k_2}, pos_2), \ldots$\}

1. compute $SI(T[i:])$ for $1 \leq i \leq n$;
2. $\text{activeState} \leftarrow \text{rootState}$;
3. for $i = 1$ to $n$ do
   4. while goto(\text{activeState}, $T[i](SI(T[i - \text{depth(\text{activeState})} + 1:]))) = \text{fail}$ do
      5. $\text{activeState} \leftarrow \text{goto}(\text{activeState}, T[i](SI(T[i - \text{depth(\text{activeState})} + 1:])))$;
   6. $\text{activeState} \leftarrow \text{goto}(\text{activeState}, T[i](SI(T[i - \text{depth(\text{activeState})} + 1:])))$;
   7. for $k \in \text{output}[\text{activeState}]$ do output \((k, i - m_k + 1)\);

$m_i = |P_i|_{\text{len}}$. The multi-track AC-automaton of $D$, denoted by $MTAC(D)$, consists of three functions: goto, failure, and output functions.

Unlike the original AC-automaton, the multi-track AC-automaton uses a multi-track character, instead of a single character to define goto. The states and goto in $MTAC(D)$ construct a trie of $\text{sort}(P_i)$ for all $P_i \in D$. Each state in $MTAC(D)$ represents a prefix of $\text{sort}(P_i)$, thus each state can be denoted by $S(W)$, where $W$ is the string obtained by concatenating the labels of the edges from the root to the state. Therefore, we can define $\text{goto}(S(P_i[: j]), P_i[j + 1]) = S(P_i[: j + 1])$ for $1 \leq i \leq r$ and $1 \leq j < m_i$. For convenience, we denote $\text{goto}(\text{goto}(s, P_i[i]), P_i[i + 1])$ as $\text{goto}(s, P_i[i + 1])$, and $\text{goto}(\text{goto}(s, P_i[j : k - 1]), P_i[k])$ as $\text{goto}(s, P_i[j : k])$. For a state $s$ and a multi-track character $C$, $\text{goto}(s, C)$ can be implemented by using multi-track character trie of depth at most $M$ nodes, thus $\text{goto}(s, C)$ can be executed in $O(M \log \sigma)$ time. The function goto can be constructed by using Algorithm 7.

Next, the failure function of a state $S(P_i[: j])$ is defined as $\text{flink}(S(P_i[: j])) = S(\text{sort}(P_i[: j]))$, where $P_i[k : j]$ is the longest proper suffix of $P_i[: j]$ such that $P_i[k : j]$ is a prefix of some $\text{sort}(P_i)$ with $P_i \in D$. Algorithm 8 shows a construction algorithm for the failure function of a multi-track AC-automaton.

Finally, the output function of the multi-track AC-automaton is similar to the original AC-Automaton. For a state $S(P_i[: j])$, the output of the state
output$(S(P[i; j]))$ is the set of patterns $P_\ell \in D$ such that $P_\ell \subseteq P_i[k : j]$ for some $1 \leq k \leq j$. The initial output function is constructed by Algorithm 6 and then updated by Algorithm 7 to get the final output function. Fig. 2 shows an example of MTAC$(D)$. In order to simplify the construction algorithm, we use a special state that reads any multi-track character to get to the root state.

**Theorem 12.** Algorithm 6 constructs the goto and initial output functions of a set $D = \{P_1, P_2, \ldots, P_r\}$ of multi-track patterns in $O(dM \log \sigma)$ time.

*Proof.* The total number of executions of goto is $d = \Sigma_{i=1}^{r} m_i$ and goto$(s, C)$ is executed in $O(M \log \sigma)$ time. \hfill \Box

**Theorem 13.** Algorithm 7 constructs the failure and output functions of a set $D = \{P_1, P_2, \ldots, P_r\}$ of multi-track patterns in $O(dM \log \sigma)$ time.

*Proof.* Updating the output function can be performed in $O(1)$ time by using list to save the output function, and update it by concatenate the list. Therefore, we can bound the running time of Algorithm 7 by counting the number of executions of goto. For each pattern $P_i$, let $s_{i,j}$ be a state such that $s_{i,j} = \text{goto}(\text{root}, P_i[i; j])$ for $1 \leq j \leq m_i$. Let $f_{i,j}$ be the number of executions of failure when finding failure$(s_{i,j})$. The maximum value of $f_{i,j}$ is bounded by $\text{depth}(\text{failure}(s_{i,j-1})) + 1$. Because the depth of failure$(s_{i,j})$ is at most $\text{depth}(\text{failure}(s_{i,j-1})) - f_{i,j} + 1$, we get $f_{i,j} \leq \text{depth}(\text{failure}(s_{i,j-2})) - f_{i,j-1} + 2$ recursively. By solving this formula, we get $\Sigma_{j=1}^{m_i} f_{i,j} \leq 2m_i$, and $\Sigma_{i=1}^{r} \Sigma_{j=1}^{m_i} f_{i,j} \leq \Sigma_{i=1}^{r} 2m_i = 2d$. Moreover, each goto is executed in $O(M \log \sigma)$ time. \hfill \Box

By using the goto, output, and failure functions, the multi-track AC-automaton can perform permuted pattern matching on a text $T$ as shown in Algorithm 8. Let activeState be the current state of the multi-track AC-automaton and $d$ be the depth of activeState. For each position $i$ on $T$, Algorithm 8 uses the sorted index of $T[i-d:]$ to determine permutation of $T[i]$ used in the goto function.

**Theorem 14.** Algorithm 8 performs permuted pattern matching on a multi-track text $T$ in $O(nN \log \sigma)$ time.

*Proof.* The running time of Algorithm 8 can be evaluated by counting the number of executions of goto. First, for each $i$, goto is executed at least once on activeState transition. Next, goto is executed to check whether the transition is fail or not. In this case, the number of executions of goto is the same as that of failure. The latter is at most $n$, because whenever goto is executed, the depth of activeState is increased by one, and whenever failure is executed, the depth of activeState is decreased by at least one. Therefore, the number of executions of goto is $O(n)$. \hfill \Box

## 5 Multi-track permuted matching automaton

In this section, we will describe a data structure called a multi-track permuted matching automaton that can perform permuted pattern matching on a multi-track text $T$ online, by preprocessing a multi-track pattern $P$. A multi-track permuted matching automaton is constructed by two functions, goto and failure. In addition, similarly to a track-trie, each state of the multi-track permuted matching automaton has a
Algorithm 9: Multi-track permuted matching automaton goto function construction algorithm

Input: Multi-track $\mathcal{P}$
Output: Goto function

1. create states $\text{rootState}$ and $\bot$;
2. $\text{goto}(\bot, w) \leftarrow \text{rootState}$ for all character $w \in \Sigma$;
3. $\text{newState} \leftarrow \text{rootState}$;
4. $\text{weight}(\bot) \leftarrow \text{weight}(\text{rootState}) \leftarrow M$;
5. for $i \leftarrow 1$ to $M$ do
6. $\text{activeState} \leftarrow \text{rootState}$;
7. for $1 \leq j \leq m$ do
8. if $\text{goto}(\text{activeNode}, \mathcal{P}[j][i]) = \text{Null}$ then
9. $\text{newState} \leftarrow \text{newState} + 1$;
10. $\text{weight}(\text{newState}) \leftarrow 1$;
11. $\text{activeState} \leftarrow \text{newState}$;
12. else
13. $\text{activeState} \leftarrow \text{goto}(\text{activeState}, \mathcal{P}[j][i])$;
14. $\text{weight}(\text{activeState}) \leftarrow \text{weight}(\text{activeState}) + 1$;
15. if $k = m$ then set $\text{activeState}$ as an accept state;

Figure 3. Multi-track permuted matching automaton of $\mathcal{P} = (\text{aaabb, abaab, bbaaa})$. The asterisk $\ast$ is a special character that matches with any characters in $\Sigma$.

weight in order to determine whether $\text{failure}$ should be executed or not. Fig. 3 shows an example of a multi-track permuted matching automaton.

For a multi-track pattern $\mathcal{P} = (p_1, p_2, ..., p_m)$, the multi-track permuted matching automaton of the pattern is denoted by $\text{MTPMA}(\mathcal{P})$. The goto function of the multi-track permuted matching automaton is similar to that of an AC-automaton, thus, each state in $\text{MTPMA}(\mathcal{P})$ represents a prefix of $p_i$, which is denoted by $S(w)$, where $w$ is the string obtained by concatenating the labels of the edges from the root to the state. Each state $S(w)$ has a weight, which is a number of tracks containing $w$ as a prefix. Moreover, a state $S(w)$ is called an accept state if $w = p_i$ for some $i$. Algorithm 9 constructs the goto function of a multi-track permuted matching automaton.

Theorem 15. Algorithm 9 constructs the goto function of a multi-track pattern $\mathcal{P}$ in $O(mM \log \sigma)$ time.

Proof. For each track, the number of executions of goto is $m$ and there are $M$ tracks in a pattern $\mathcal{P}$. Moreover, goto can be executed in $O(\log \sigma)$ time. \qed

Next, we will define the failure function of a multi-track permuted matching automaton. Let $S_j$ be the set of states that have depth $j$ and $S(p_i[: j]) \in S_j$ be a state
Algorithm 10: Multi-track permuted matching automaton failure function construction algorithm

Input: Multi-track \( P \), goto function
Output: Failure function

1. \( activeStates[i] \leftarrow rootState \) for \( 1 \leq i \leq M \);
2. \( failure(rootState) \leftarrow \perp \);
3. for \( i \leftarrow 1 \) to \( m \) do
   4. \( tempStates \leftarrow activeStates; \)
   5. \( failFlag \leftarrow true; \)
   6. while \( failFlag = true \) do
      7. \( failFlag \leftarrow false; \)
      8. \( vector failureStates; \)
      9. for \( j \leftarrow 1 \) to \( |tempStates| \) do
         10. \( failureStates[j] \leftarrow failure(tempStates[j]); \)
      11. if \( failFlag = true \) then
           12. \( tempStates \leftarrow failureStates; \)
      13. else
           14. for \( a \) such that goto(\( activeStates[j], a \)) = \( s \neq \perp \) do
              15. \( failure(s) \leftarrow goto(failureStates[j], a); \)
      16. clear \( tempStates; \)
      17. for \( j \leftarrow 1 \) to \( |activeStates| \) do
         18. for \( a \) such that goto(\( activeStates[j], a \)) = \( s \neq \perp \) do
            19. \( tempStates.add(s); \)
      20. \( activeStates \leftarrow tempStates; \)
21. Function \( isFail(activeStates, failureStates) \)
22. for \( j \leftarrow 1 \) to \( |activeStates| \) do
   23. for \( a \) such that goto(\( activeStates[j], a \)) = \( s \neq \perp \) do
      24. if goto(\( failureStates[j], a \)) = \( \perp \) then return true;
      25. else
         26. \( nextState \leftarrow goto(failureStates[j], a); \)
         27. \( temp(nextState) \leftarrow temp(nextState) + weight(s); \)
      28. if temp(nextState) > weight(nextState) then return true;
      29. return false;

of depth \( j \). The failure function of the state is \( failure(S(p_i[:j])) = S(p_k[:\ell]) \) \( \in \mathcal{L} \) such that \( p_k[:\ell] \) is a proper suffix of \( p_i[:j] \) and \( P[:\ell] \) permuted matches with a suffix of \( P[:j] \). Note that the definition of this failure function is similar to that of the multi-track KMP algorithm introduced in [3].

Algorithm 10 constructs the failure function of a multi-track permuted matching automaton. We use a state pointer for each track in the pattern. Similarly to a tracktrie, there are two conditions that are considered as failure in a multi-track permuted matching automaton. The first condition is when it cannot find the goto transition, and the second condition is when the number of state pointers in the state is more than the weight of the state.

Theorem 16. Algorithm 10 constructs the failure function of a multi-track permuted matching automaton in \( O(mM \log \sigma) \) time.
Algorithm 11: Multi-track permuted matching automaton matching algorithm

\textbf{Input:} goto and failure functions
\textbf{Output:} Permuted match positions

\begin{enumerate}
  \item \texttt{activeStates}[i] \leftarrow \texttt{rootState} for 1 \leq i \leq N;
  \item for 1 \leq i \leq n do
    \begin{enumerate}
      \item failFlag \leftarrow \texttt{true};
      \item while failFlag = \texttt{true} do
        \begin{enumerate}
          \item failFlag \leftarrow \texttt{false};
          \item failFlag \leftarrow \texttt{isFail(activeStates, T, i)};
          \item if failFlag = \texttt{true} then
            \begin{enumerate}
              \item for j = 1 to N do \texttt{activeStates}[j] \leftarrow \texttt{failure(activeStates)};
            \end{enumerate}
          \item else
            \begin{enumerate}
              \item for j = 1 to |activeStates| do \texttt{activeStates}[j] \leftarrow \texttt{goto(activeStates[j], T[i][j])};
            \end{enumerate}
          \end{enumerate}
        \end{enumerate}
      \end{enumerate}
    \end{enumerate}
  \end{enumerate}

\begin{enumerate}
  \item if \texttt{activeStates}[1] is an accept state then output \(i - m + 1\);
  \item \textbf{Function} \texttt{isFail(activeStates, T, i)}
    \begin{enumerate}
      \item for j = 1 to N do
        \begin{enumerate}
          \item if \texttt{goto(activeStates}[j], T[i][j]) = fail then return \texttt{true} ;
          \item else
            \begin{enumerate}
              \item nextState = \texttt{goto(activeStates}[j], T[i][j]);
              \item temp(nextState) = temp(nextState) + 1;
              \item if temp(nextState) > weight(nextState) then return \texttt{true} ;
            \end{enumerate}
        \end{enumerate}
      \end{enumerate}
    \end{enumerate}
\end{enumerate}

Proof. Similar to the proof of Theorem 13, the failure and goto functions are executed \(O(mM)\) times. Moreover, execution time of the failure function is \(O(1)\) and that of the goto function is \(O(\log \sigma)\). \(\square\)

Finally, by using the goto and failure functions, Algorithm 11 can perform permuted pattern match on a multi-track text \(T\). Algorithm 11 uses \(N\) pointers \texttt{activeStates} to point the current states. Note that all \texttt{activeStates} always have the same depth. Similarly to Algorithm 10, Algorithm 11 also uses two conditions to determine whether it should execute the failure function or not. If any of the \texttt{activeStates} is fail, then all of the \texttt{activeStates} execute the failure function, otherwise \texttt{activeStates} execute the goto function.

Theorem 17. Algorithm 11 performs permuted pattern match on a multi-track string \(T\) in \(O(nN \log \sigma)\) time.

Proof. Similarly to the proof of Theorem 14, the number of executions of the failure and goto function is \(O(nN)\). Since the execution time of the failure function is \(O(1)\) and the goto function is \(O(\log \sigma)\), Algorithm 11 runs in \(O(nN \log \sigma)\) time. \(\square\)

6 Experiments

We evaluate performance of our algorithms by conducting experiments on full-permuted pattern matching. We compared the running time of our algorithms with existing algorithms, AC automaton based algorithm [6] and KMP based algorithm [3]. We ran the algorithms on a computer with Intel Xeon CPU E5-2609 8 cores 2.40 GHz, 256 GB memory, and Debian Wheezy operating system.
We set the parameter values as follows, $n = 100000$, $m = 10$, $N = M = 1000$, and $\sigma = 2$, and changed one of the parameters in each experiment to see the running time of the algorithms with respect to the parameters. We used randomly generated texts and patterns, and inserted 50 occurrences of a pattern into each text to make sure that there are occurrences of the pattern in the text.

The result of the experiments are shown in Fig. 4 (a)–(d), where one of the parameters $n$, $N$, $m$, and $\sigma$ is changed respectively. First, we can see that the running time of the algorithms increase linearly with respect to the length and track count of the text, and is not much affected by the pattern length or the alphabet size. The running times of MT-BM and MT-H are almost the same, and the running times of these algorithms are faster when a track-trie is used.

Multi-track AC-automaton is slower than the MTKMP algorithm on a single pattern matching, although it can support dictionary matching on multi-track strings. We can also see that multi-track permuted matching automaton runs faster than the MTKMP and Filter-MTKMP algorithms, as it is an improvement of MTKMP algorithm.

7 Concluding remarks

In this paper, we focused on full permuted pattern matching problems, where the track count $N$ of a text equals to the track count $M$ of a pattern. In general, the permuted pattern matching problem is more difficult if $N > M$. For example, when we construct $GS[i]$ for the full-permuted pattern matching problem, we compute the minimum value of $s$ such that $T[i-s+1 : m-s] \preceq T[i+1 : m]$, because we know that if a substring $T[j : j + m - i - 1]$ of the text does not match with $T[i+1 : m]$,
then $T[j : j + m - i - 1] \not\sqsubseteq P[i - k + 1 : m - k]$ for $0 < k < s$. However, in the case where $N > M$, there is a possibility that $P[i - k + 1 : m - k]$ matches with the $T[j : j + m - i - 1]$, and we might miss the occurrences of the pattern if we use the same shift as in the case of full permuted pattern matching. This problem is also arises in multi-track AC-automaton and multi-track permuted matching automaton when we try to construct the failure function. We should find another condition to define the failure function for these algorithms.

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