# LF Successor: Compact Space Indexing for **Order-Isomorphic Pattern Matching**

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#### — Abstract -11

Two strings are order isomorphic iff the relative ordering of their characters is the same at all positions. 12 For a given text T[1, n] over an ordered alphabet of size  $\sigma$ , we can maintain an order-isomorphic suffix 13

tree/array in  $O(n \log n)$  bits and support (order-isomorphic) pattern/substring matching queries 14

efficiently. It is interesting to know if we can encode these structures in space close to the text's size 15

of  $n \log \sigma$  bits. We answer this positively by presenting an  $O(n \log \sigma)$ -bit index that allows access 16

to any entry in order-isomorphic suffix array (and its inverse array) in  $t_{SA} = O(\log^2 n / \log \sigma)$  time. 17

For any pattern P given as a query, this index can count the number of substrings of T that are 18

order-isomorphic to P (denoted by occ) in  $O((|P|\log \sigma + t_{SA})\log n)$  time using standard techniques. 19

Also, it can report the locations of those substrings in additional  $O(occ \cdot t_{SA})$  time. 20

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#### 1 Introduction 24

An index of a text T[1, n] is a data structure that is capable of counting/reporting all those 25 substrings of T that "match" (as per the problem specific definition of match) with any given 26 pattern P. We use  $\Sigma$  to denote the alphabet set (of size  $\sigma$ ) from which the characters in 27 T are drawn from. WLOG, we assume that T[n] =, a special character that does not 28 appear anywhere else in T. Two fundamental indexes for exact pattern matching are the 29 suffix tree (ST) [21] and the suffix array (SA) [16]. Both takes  $\Theta(n \log n)$  bits of space, which 30 could be much larger than the  $n \log \sigma$  bits needed to store T optimally. The first succinct 31 indexes that use close to  $n \log \sigma$  bits are the Compressed Suffix Array (CSA) [12] and the 32 FM-index [6]. The crucial component of FM Index is Burrows-Wheeler Transform (BWT) [2] 33 and its associated operation called the Last-to-Front (LF) mapping. The subsequent work 34 lead to fully functional suffix trees in succinct space [20]. See [18] for further reading. 35

The parameterized ST [1, 17] and the order-isomorphic ST [4] are two popular ST variants 36 under the class known as suffix trees with missing suffix links [3]. As they do not hold some 37 critical structural properties of the original ST, their compression is challenging. Recently, 38 Ganguly et al. showed that it is indeed possible to compress the parameterized suffix arrays. 39 They implemented LF mapping using a BWT-like transformation called the parameterized 40 BWT [9]. However, such a transformation is hard to define for order-isomorphic ST because 41 LF mapping could lead to multiple changes in the (encoding of) associated suffixes. To that 42 end, we present a novel technique for implementing the LF mapping (named LF Successor), 43 leading to the first compact space index for order-isomorphic pattern matching. 44



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# 45 1.1 Generalizing the Philosophy of BWT and LF Mapping

We present an overview of our approach using three problems: (i) traditional/exact matching,
(ii) parameterized matching, and (iii) order-isomorphic matching, in that order, to show
gradation and successive generalization of the LF mapping approach.

**Indexing for Traditional Matching:** The classic solution is the suffix tree (ST), a compact 49 trie over all the suffixes of T. In a ST, each edge is labeled by some substring of T such 50 that the concatenation of the edge labels on each root to leaf path represents a particular 51 suffix of T. Based on the lexicographic order of the suffixes, a suffix array SA[1,n] (whose 52 entries correspond to each leaf in the suffix tree in left to right order) marks the starting 53 index (in T) of the suffix corresponding to the  $i^{th}$  leftmost leaf  $\ell_i$ . Thus, SA[i] = t and the 54 inverse suffix array entry  $\mathsf{SA}^{-1}[t] = i$  iff the suffix corresponding to  $\ell_i$  is T[t, n]. Inverse 55 suffix array associates each position i in the text with leaf position (rank) of suffix T[i..n] in 56 the suffix tree. Also, for t > 1,  $\mathsf{LF}(i) = j$  iff the leaf  $\ell_j$  corresponds to the suffix T[t-1,n], 57 i.e., SA[j] = t - 1. Formally,  $LF(i) = SA^{-1}[SA[i] - 1]$  (for the special case of SA[i] = 1, we 58 take  $SA^{-1}[0] = SA^{-1}[n]$ ). The Burrows-Wheeler Transform is an array BWT[1, n], such that 59  $\mathsf{BWT}[i] = T[\mathsf{SA}[i] - 1]$ . Computing LF mapping is central to BWT based pattern matching, 60 and in some sense, the BWT enables efficient computation of LF mapping. A fundamental 61 result is that once we store the BWT, and its associated counting structures, we can replace 62 the costly (space-wise) suffix array by a (cheaper) sampled suffix array [6]. 63

Indexing for Parameterized Matching: Here, P matches with T at position i iff there 64 is one-to-one correspondence between the characters of P and T[i, i + |P| - 1]. For example, 65 xwyx can match with *abca* as x can be mapped to a, b to w, and c to y. However, *abca* does 66 not match with xyxw because both a and c cannot be mapped to x. Baker [1] presented 67 an encoding called prev(S) which encodes every character in the string by replacing it by 68 its distance to the previous occurrence of the same character and using 0 if the character 69 has not occurred before. For example, prev(xwxyywx) = 0020144. It is not hard to see that 70 two strings X and Y are a parameterized match iff prev(X) = prev(Y). The parameterized 71 suffix tree is a compact trie over all strings in  $\{\operatorname{prev}(T[i, n-1]) \circ \$ \mid 1 \leq i < n\}$ , where  $\circ$ 72 denotes concatenation. Then, the parameterized matching of P in T can be performed via 73 traditional matching of prev(P) in this suffix tree. The same notion of LF-mapping can be 74 defined and implemented in succinct space using a BWT-like transform [9]. 75

Indexing for Order-isomorphic Matching: This problem has received significant at-76 tention since its inception [4, 13, 15], not only due to its simple and elegant formulation, 77 but also due its to ability to model string matching problems in other domains (e.g., music 78 retrieval, analysis of time series data, etc) where the relative ordering of characters has to be 79 matched rather than the string itself. Here, there is a total ordering between the symbols in 80  $\Sigma$ . The pattern P matches with text T[1, n] at position i if for any j, k in [1, |P|], P[j] < P[k]81 iff T[i+j-1] < T[i+k-1]. Similar constraints apply for P[j] > P[k] and P[j] = P[k]. 82 For example, 1423 can match with 2957 but not with 2657 because 6 < 7 and 4 > 3. A new 83 encoding "pred" works in this case. This is a slight modification of the scheme in [4]. 84

▶ Definition 1 (pred encoding). Given a character S[i] in string S, its predecessor is a character q which occurs in S[1, i - 1] such that  $q \leq S[i]$  and there is no other character rin S[1, i - 1] such that  $q < r \leq S[i]$ . Given a string S, pred(S)[i] is defined as follows: let alphabet symbol q be the predecessor of S[i] in S[1, i - 1] and let position j be the rightmost occurrence of q in S[1, i - 1]. Then, pred(S)[i] = (i - j) if  $q \neq S[i]$ , (i - j)' if q = S[i], and 0 if qdoes not exist. Thus pred(S) is a string over the alphabet  $\{0, 1, 1', 2, 2', ..., |S| - 1, (|S| - 1)'\}$ .

Thus, in pred encoding, every position (character) in T points to its closest predecessor 91 on the left. For e.g.,  $pred(0869514371) = 0\ 1\ 2\ 2\ 4\ 5\ 1\ 2\ 6\ 4'$ . We refer to primed characters 92 as an equality version of their non-primed counterparts. For example, 2' is equality variant 93 of 2. It is easy to see that two strings X and Y are order-isomorphic iff pred(X) = pred(Y). 94 The order-isomorphic suffix tree [4] of T is the compacted trie over all strings in 95  $\{\operatorname{pred}(T[i, n-1]) \circ \$ \mid 1 \leq i < n\}$ . We order the encoded characters as: 0 < 1 < 1' < 2 < 1'96  $2' < \cdots < n-1 < (n-1)' <$ \$. The order-isomorphic suffix array is such that its ith entry 97 denotes the starting location of the suffix corresponding to *i*th leaf  $\ell_i$ . Again, as in earlier 98 cases, the LF mapping operation for an order isomorphic suffix tree where  $j = \mathsf{LF}(i)$  maps 99 leaf  $\ell_i$  to leaf  $\ell_j$ . The suffix j is obtained by prepending to suffix i the character which occurs 100 just before the starting location of suffix i in T. 101

# <sup>102</sup> 1.2 Challenges in Implementing (Generalised) LF Mapping Compactly

The challenge here is in deciding what needs to be precomputed and stored, so that  $\mathsf{LF}(i)$  for any *i* can be computed efficiently. At its root, we need to solve the following: given two leaves  $\ell_i$  and  $\ell_j$  with i < j, how quickly can we decide whether  $\mathsf{LF}(i) < \mathsf{LF}(j)$  or  $\mathsf{LF}(i) > \mathsf{LF}(j)$ .

In the case of **traditional matching**, the order between  $\mathsf{LF}(i)$  and  $\mathsf{LF}(j)$  will stay the same if the corresponding suffixes have the same *previous character* (which are  $\mathsf{BWT}[i]$  and  $\mathsf{BWT}[j]$ ). It will flip iff the previous character of the suffix corresponding to j is smaller than that of i in the lexicographic order. Therefore pair-wise comparison between such i and jcan be computed in "bulk" for i against all j's, enabling "quick" computation of  $\mathsf{LF}(i)$  [6].

In the case of **parameterized matching**, this order determination is more sophistic-111 ated [9]. Here, it becomes essential to see how prepending the previous character changes the 112 canonical encoding of a suffix and how can this information be stored compactly. For example, 113 consider T[1, n] = abcabbadcb and the suffix T[4, n] = abbadcb. Its previous character T[3] is 114 c. When we prepend this character, the suffix (in traditional ST) becomes cabbadcb. The 115 string corresponding to T[4,n] in the parameterized suffix tree is prev(T[4,n]) = 0013004. 116 When T[4, n] is prepended with c and prev is applied, apart from the insertion (of 0) at 117 the beginning, there is one change within prev of T[4, n], which is at the first occurrence 118 of c in T[4, n]. Thus, the second last character in the encoding switches from 0 to 6, i.e., 119  $\operatorname{prev}(T[3,n]) = 00013064$ . Ganguly et al. [9] show how to record this change-location for 120 each suffix succinctly using the paramaterized-BWT, which supports LF mapping. Again, as 121 in the case of traditional pattern matching, we can compare two suffixes in terms of their 122 LF mapping by comparing which suffix changes first – in case at least one of them changes 123 before their longest common prefix (LCP). See [10, 14, 8] for some related results. 124

We now illustrate order-isomorphic matching using an example T[1, n] = 20869514371. 125 Then, T[2, n] = 0.869514371 and pred(T[2, n]) = 0 1 2 2 4 5 1 2 6 4'. However, pred after 126 prepending T[1] = 2, i.e., pred(T[1, n]) is 0 0 2 3 2 5 5 7 8 6 4'. Observe how the encoding 127 changes when we go from T[2,n] to T[1,n]. Apart from the obvious 0 in front, there are 128 "five" other entries whose predecessor changed due to the newly inserted 2. Both earlier 129 problems, traditional and parameterized, incurred only a constant (1 or 2) number of changes 130 per suffix, and hence it was possible to record this information compactly. However, the 131 number of changes here can be as large as  $\sigma$ , which makes it challenging and the existing 132 techniques do not seem adequate. 133

Our approach: Even though many positions change, and they cannot be explicitly stored, the structural properties of this problem show that the *last point of change* (the rightmost value which changes) during LF is what matters. In the example above, the rightmost character which changes its encoding is 3 and its encoding changes from 2 to 8.





The good part is that once we know this, we can deterministically pinpoint which other previous (to the left) locations changed their encoding. Thus, we can register/store one particular value and all previous changes can be captured based on that. Yet this only gives us existential dependency and not an algorithmic tool.

## 142 **1.3 Our Contribution**

The existing results on this topic are partial and conditional. For example, the  $O(n \log \log n)$ bit by Gagie et al. [7] can answer only counting queries, that too for short patterns of size  $O(\log^{O(1)} n)$ . Another result by Decaroli et al. [5] is based on heuristics. We show:

**Theorem 2.** Let T[1, n] be any text over an ordered alphabet of size  $\sigma$ . By maintaining an  $O(n \log \sigma)$ -bit index, we can decode any entry in the order-isomorphic suffix array of T, as well as in its inverse array, in  $O(\log^2 n / \log \sigma)$  time.

At the heart of proving Theorem 2 lies a novel way of implementing LF mapping. We call this as LF Successor. It goes one step beyond the current approach of simulating *Suffix Array using LF mapping*.

# <sup>152</sup> 2 Structural Properties of the Order Isomorphic Suffixes

<sup>153</sup> In this section we introduce two key lemmas explaining the structural properties of the pred <sup>154</sup> encoding. In other words, we see where the changes occur when a new character is prepended <sup>155</sup> to the suffix. Firstly, we formally define a *change point* as follows,

<sup>156</sup> ► Definition 3 (Change Point). Given a string T[r, z] along with its pred encoding pred(T[r, z]), <sup>157</sup> point  $i \in [r, z]$  is a change point if  $pred(T[r - 1, z])[i - r + 2] \neq pred(T[r, z])[i - r + 1]$ .

In other words, when a character is prepended to T[r, z] (making it T[r-1, z]) the encoding of the character T[i] changes. Here point *i* means position in the text.

▶ Definition 4 (Skyline). A point *i* in text substring T[r, z] covers a point *j* iff i < j and  $T[i] \leq T[j]$ .  $\gamma$ -skyline of T[r, z] is set of all points  $i \in [r, z]$  such that  $T[i] \geq \gamma$  and it is not covered by any point  $j \in [r, i - 1]$  such that  $T[i] \geq T[j] \geq \gamma$ . When  $\gamma = T[r - 1]$ , we simply refer to this as skyline of T[r, z]. Given a point  $d \in T[r, z]$ , the skyline induced by *d* is same as T[d]-skyline of T[r, z] (i.e., the one obtained by setting  $\gamma = T[d]$ ).

Lemma 5 proves that all the change points of T[r, z] are exactly the ones that are on the skyline (See Figure 1 for geometric interpretation). Secondly, as mentioned earlier, although

there are many change points in the order isomorphic setting, given the rightmost or last change point we can uniquely determine all the previous change points (see Figure 1). More formally, it can be stated as follows.

▶ Lemma 5 (Skyline Lemma). Given a text substring T[r, z] and it rightmost change point d of the substring, all the change points in T[r, z] can be determined based on d. These are precisely the points in T[d]-skyline of T[r, z].

**Proof.** Firstly, let's consider any change point  $i \in T[r, z]$ . Since its pred-encoding changes due to prepending of T[r-1] the new predecessor of point i in T[r-1, z] must be r-1 (i.e., pred(i) = i - r + 1). This means  $T[i] \ge T[r-1]$ . Also if point i was covered by point j such that j < i and  $T[j] \ge T[r-1]$ , then predecessor of i in T[r-1, z] would still be j.

For the other way around, consider any point i on the skyline of T[r, z]. The predecessor of i in T[r, z] cannot be any point j such that  $T[j] \ge T[r-1]$  (by definition of cover), Thus, when T[r-1] gets prepended, this will become the new predecessor of i. Hence, i is a change point.

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Next, given two suffixes and their last common change points, all their previous change points will be the same. We state this as a lemma below. Here we define rank(x, T[r, z]) as the number of values in T[r, z] that are less than or equal to x.

▶ Lemma 6 (Last Common Point of Change (LCPC) Lemma). Given two text substrings T[r, r+l-1] and T[s, s+l-1] such that pred(T[r, r+l-1]) = pred(T[s, s+l-1]), let d be the greatest value such that r+d-1 and s+d-1 are the change points in T[r, r+l-1] and T[s, s+l-1] respectively. Thus, the dth point is the last common change point of substrings T[r, r+l-1] and T[s, s+l-1]. Then for every  $e \in [1, d-1]$ , r+e-1 is a change point in T[r, r+l-1] if and only if s+e-1 is a change point in T[s, s+l-1].

**Proof.** Firstly, w.l.o.g, let  $\mathsf{rank}(T[r-1], T[r, r+l-1]) < \mathsf{rank}(T[s-1], T[s, s+l-1])$ . Now, there 191 is no point p such that  $r and <math>\operatorname{rank}(T[r-1], T[r, r+l-1]) < \operatorname{rank}(T[p], T[r, r+l-1]) < d$ 192  $\mathsf{rank}(T[s-1], T[s, s+l-1])$ . This is because if there was such a point p, then d cannot be a 193 change point of T[r, r+l-1], because d will be covered by point p. Secondly, if  $e \in [1, d-1]$ 194 is a change point of T[r, r+l-1] and suppose q was the predecessor of e before prepending 195 of the new point, then  $\mathsf{rank}(T[r+q+1], T[r, r+l-1]) < \mathsf{rank}(T[r-1], T[r, r+l-1]) < \mathsf{ra$ 196  $\operatorname{rank}(T[r+e+1], T[r, r+l-1])$ . Therefore, we can say that  $\operatorname{rank}(T[r+q+1], T[r, r+l-1]) < 1$ 197  $\operatorname{rank}(T[r-1], T[r, r+l-1]) < \operatorname{rank}(T[s-1], T[s, s+l-1]) < \operatorname{rank}(T[r+e+1], T[r, r+l-1]).$  Here 198 if we just consider the ranking orders of T[s, s+l-1], then  $\mathsf{rank}(T[s+q+1], T[s, s+l-1]) < 1$ 199 rank(T[s-1], T[s, s+l-1]) < rank(T[s+e+1], T[s, s+l-1]) because pred(T[r, r+l-1]) = rank(T[s+e+1], T[s+e+1]) = rank(T[s+e+1], T[s+e+1])200  $\operatorname{pred}(T[s, s+l-1])$ . This implies that T[s-1] is the new predecessor of T[s+e+1], which 201 means e is also a change point of T[s, s+l-1]. 202

The encoding of characters which are not change points will stay the same in pred(T[r - 1, r + d - 1]) and pred(T[s - 1, s + d - 1]). On the characters which are change points, their  $pred(\cdot)$  values point to T[r - 1] (resp. T[s - 1]). Since pred encodes distance to the predecessor character, these pred values will be the same for corresponding change points in T[r - 1, r + d - 1] and T[s - 1, s + d - 1]. Thus,  $pred(\cdot)$  encoding for both agree up to the first d + 1 characters.

# <sup>209</sup> **3** LF Successor and Order-Isomorphic Text Indexing

Recall our encoding scheme pred (Definition 1) and the lexicographic order of encoded symbols:  $0 < 1 < 1' < 2 < 2' < \cdots < n-1 < (n-1)' <$ \$. We will now introduce a few

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more terminologies related to the order-isomorphic suffix tree (ST). We shall refer to any 212 character on any substring representing an edge label as a "point" in ST. An edge is labeled 213 by a substring represented by that edge in ST. For any point c in ST, let path(c) denote the 214 concatenation of labels from the root until c. We shall denote char(c) as an (pred encoded) 215 character represented by point c. We will also refer to nodes in ST as points. In this case, the 216 node will be represented by the character just above it (i.e., the last character of the label 217 of its parent edge). For any point c, depth(c) is length of path(c) and  $\alpha \text{Depth}(c) = \text{number}$ 218 of distinct symbols in  $T[r, r + \operatorname{depth}(c) - 1]$ , where T[r, n] is any suffix passing through c. 219 Note that this  $\alpha$ Depth indeed refers back to the original text instead of encoded text (in 220 terms of encoded text this would be the number of non-primed characters). We call this 221 the alphabet depth of point c. We shall generalize this notion as alphabet length for any 222 string S as  $\alpha(S)$  = number of unique alphabet symbols in S. For any two suffixes i and j 223 (i.e., suffixes corresponding to leaves  $\ell_i$  and  $\ell_j$ ), let point  $v = \mathsf{lca}(i, j)$  be the lowest common 224 ancestor (LCA) of  $\ell_i$  and  $\ell_j$ . Then, the length of longest common prefix  $\mathsf{LCP}(i, j) = \mathsf{depth}(v)$ 225 and  $\alpha \mathsf{LCP}(i, j) = \alpha \mathsf{Depth}(v)$ . 226

The locus of a pattern P is the highest node u such that pred(P) is a prefix of path(u). 227 Every leaf  $\ell_i$  in the sub-tree of u corresponds to an occurrence of P at a position in T given 228 by SA[i]. Let [sp, ep] be the suffix range of P, where  $\ell_{sp}$  (resp.  $\ell_{ep}$ ) is the leftmost (resp. 229 rightmost) suffix in the subtree of u. We note that in order to support pattern matching, we 230 need to (a) compute the suffix range [sp, ep] of P and (b) decode suffix array values SA[i], 231  $i \in [sp, ep]$ . Using a standard binary search on the suffix array along with the text, we can 232 find the suffix range. Storing SA[i] for every leaf  $\ell_i$  is too costly as it will take  $\Theta(n \log n)$ 233 bits. The goal is to encode suffix array values in compact space so that they can be decoded 234 efficiently. We show how to achieve this using a sampled suffix array and LF mapping. 235

Recall that LF mapping is defined as:  $j = \mathsf{LF}(i)$  iff  $\mathsf{SA}[j] = \mathsf{SA}[i] - 1$ . We explicitly store  $\mathsf{SA}[\cdot]$  values belonging to the set  $\{1, 1 + \Delta, 1 + 2\Delta, \ldots, n\}$ , where  $\Delta$  is a tunable parameter to be set later. For any suffix i, where  $\mathsf{SA}[i]$  has not been stored, we repeatedly apply LF mapping operation (starting from i) until we reach j such that  $\mathsf{SA}[j]$  has been sampled. Then,  $\mathsf{SA}[i] = \mathsf{SA}[j] + k$ , where k is the number of LF operations applied; note that  $k \leq \Delta$ . Thus, we have reduced the problem to that of computing  $\mathsf{LF}(\cdot)$ . To this end, we introduce *LF successor*, defined as:

#### i' is called the LF-successor of i iff $\mathsf{LF}(i') = \mathsf{LF}(i) + 1$

We denote it as  $i' = \mathsf{LFS}(i)$ . Throughout this paper, we use i' to denote  $\mathsf{LFS}(i)$  for any suffix i. 236 Thus, the leaves  $\ell_i$  and  $\ell_{i'}$  are mapped by using LF operation to leaves  $\ell_i$  and  $\ell_{i+1}$  respectively. 237 To compute LF mapping, we again use a sampling technique. Specifically, we explicitly store 238  $\mathsf{LF}(\cdot)$  values in the set  $\{1, 1 + \Delta, 1 + 2\Delta, \dots, n\}$ , thereby reducing the problem of computing 239 LF mapping to that of computing at most  $\Delta$  number of LF successors. In Section 4, we 240 show how to compute LF successor in time  $t_{LFS} = O(\log \sigma)$  by using an  $O(n \log \sigma)$ -bit index. 241 Therefore, LF can be computed in time  $t_{\text{LF}} = \Delta \cdot t_{\text{LFS}}$  and  $t_{\text{SA}} = O(\Delta \cdot t_{\text{LF}})$ . Theorem 2 242 follows immediately by fixing  $\Delta = \log_{\sigma} n$ . 243

# <sup>244</sup> **4** Computing LF Successor in Time $O(\log \sigma)$ Using Compact Space

In this section, we shall describe what additional information should be augmented to each leaf of the suffix tree, so that given *i*th leaf  $\ell_i$ , we can quickly identify which leaf is its LF successor LFS(*i*). We shall first describe the data structure and then the query algorithm for computing LFS(*i*). We saw earlier that we will be writing SA values and LF values only for

 $n/\Delta$  positions. Thus, this takes  $O(n \log \sigma)$ -bit space by choosing  $\Delta = \log_{\sigma} n$ . What remains to be seen is how to compute LF successor for a given suffix associated with the leaf  $\ell_i$ . If we explicitly write it at all the leaves, it will take  $\Theta(\log n)$  bits per leaf. Since there is no sampling here, this will lead to  $\Theta(n \log n)$  bits which will defeat our purpose. Thus, our approach here is to store only  $O(\log \sigma)$  bits of information in each leaf and yet be able to compute the LF successor quickly.

#### **4.1** Four Cases for Suffix and its LF Successor

For the discourse in this section, we use the following terminology. Let i' be  $\mathsf{LFS}(i)$ . Let the starting position in the text for suffix denoted by leaf  $\ell_i$  be r (i.e,  $r = \mathsf{SA}[i]$ ), and that of  $\ell_{i'}$ be r'. Let d denote the length of longest common prefix (LCP) of these suffixes  $\mathsf{pred}(T[r,n])$ and  $\mathsf{pred}(T[r',n])$ . Thus, T[r, r+d-1] and T[r', r'+d-1] are order isomorphic. Inevitably, we will also focus on suffixes  $\mathsf{LF}(i)$  and  $\mathsf{LF}(i')$  which are encodings of text suffixes T[r-1,n]and T[r'-1,n] respectively.

Now, we distinguish two cases with respect to leaf  $\ell_i$  (and its LF successor  $\ell_{i'}$ ) – case (1) if T[r-1, r+d-1] is not order isomorphic with T[r'-1, r'+d-1], and case (2) T[r-1, r+d-1] is order isomorphic with T[r'-1, r'+d-1] i.e., prepending of character T[r-1] (resp., T[r'-1]) to the left still maintains order-isomorphism until the LCP i.e., pred $(T[r-1, r+d-1]) = \operatorname{pred}(T[r'-1, r'+d-1]).$ 

First, we shall talk about case (1). In this case, let us consider all the change points of T[r, r + d - 1] and T[r', r' + d - 1]. Let *e* be their last common change point. If  $T[r' - 1] \neq T[r' + e - 1]$  then we call it case (1a) - the *breakaway case*. Else, we call it case (1b) - the *equality case*. In case (1a), let *g* be the first change point after *e* for T[r', r' + d - 1]. We now define LF-image, which generalizes the concepts of Wiener links and LF mapping.

▶ Definition 7 (LF-image). Let c be any point in the suffix tree and point p above c be such that for at least one of the suffixes T[r, n] passing through c, p is the last change point before c. The LF-image of c with respect to a change point p, denoted by LF(c, p, EQBT) is a point representing the position of (pred encoding of ) T[r-1, r + depth(c) - 1]. EQBT is called the equality bit and is set to 1 if p is an equality change point and 0 otherwise.

For any such suffix *i* passing through *c* with change point *p* being the last one above *c*, LF(*i*) passes through LF(*c*, *p*, EQBT). So if q = LF(c, p, EQBT), path(q) = pred(T[r - 1, r + depth(c) - 1]). Note that the same point *c* can have multiple LF-images based on which change point above *c* is taken as the last one and also if that is equality change point or not. If leaf  $\ell_i$  falls under case 2, we shall again break this case into cases (2a) and (2b). In case (2a) we consider i < i' (we call this ordered case) and in case (2b) we consider i' < i (we call this *inverting case*). We say that a suffix *l inverts* over suffix *k* iff l < k and LF(l) > LF(k).

▶ Lemma 8. If suffixes *i* and *i'* = LFS(*i*) fall in case 2 then they have the same change points (and also the same type of change points - equality or not) until lca(i,i'). Then *i* cannot have a change point immediately after lca(i,i'). Moreover, if they fall in case (2b) then *i'* must have a change point immediately after lca(i,i').

Proof. Let the point c = lca(i, i'). For case (2) we know that T[r-1, r+d-1] is order isomorphic with T[r'-1, r'+d-1] i.e. pred(T[r-1, r+d-1]) = pred(T[r'-1, r'+d-1]). This means that *i* and *i'* have all the same change points until *c*.

Now let p be the last common change point of i and i' i.e. p = LCPC(i). Here, LCPC(i) denotes the last common point of change of i and its LFS i'. Additionally, suppose

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<sup>293</sup>  $b = \mathsf{LF}(c, p, EQBT)$ . So this means that  $\mathsf{LF}(i)$  and  $\mathsf{LF}(i')$  will pass through b. As per the <sup>294</sup> definition of LF successor we know that,  $\mathsf{LF}(i) < \mathsf{LF}(i')$ . More specifically,  $\mathsf{LF}(i') = \mathsf{LF}(i) + 1$ .

Firstly, lets say that *i* has a change point right after *c* (note that both *i* and *i'* cannot change immediately after *c*). Now if we see all the branches under *b*, then  $\mathsf{LF}(i)$  will fall under the rightmost branch (or just previous branch depending on whether that change

<sup>298</sup> point is of equality type or not). This leads to  $\mathsf{LF}(i') < \mathsf{LF}(i)$  which is not possible as per <sup>299</sup> the definition of LF successor. Thus, *i* cannot have a change point immediately after *c*.

Now, if we take the case (2b), then i' inverts over i because  $\mathsf{LF}(i')$  must be greater than  $\mathsf{LF}(i)$ . For this to happen i' must have a change point immediately after c.

<sup>302</sup> The proof of the lemma above also leads us to the following fact.

**Fact 1.** Let c be a point immediately above any node v. Let  $b = \mathsf{LF}(c, p, EQBT)$  where p is a point on  $\mathsf{path}(c)$  and is the last common change point (of type equality or non-equality) for two suffixes i and  $i' = \mathsf{LFS}(i)$ , passing through c and lying in case 2b. Then, i' has a change point immediately after v. Moreover, there cannot be another pair of case (2b) suffixes j and  $j' = \mathsf{LFS}(j)$ , which have the same last common point of change p, and j' changes immediately after v.

**Proof.** If any two of the suffixes i' and j', where  $i' = \mathsf{LFS}(i)$  and  $j' = \mathsf{LFS}(j)$ , passing through v have a change point right after the node v and their last common change point is p, then under the point  $b = \mathsf{LF}(c, p, EQBT)$  only one of their  $\mathsf{LF}$  values (either  $\mathsf{LF}(i')$  or  $\mathsf{LF}(j')$ ) can be next to their respective  $\mathsf{LF}(i)$  or  $\mathsf{LF}(j)$ . That implies only one of either  $\mathsf{LF}(i') = \mathsf{LF}(i) + 1$ or  $\mathsf{LF}(j') = \mathsf{LF}(j) + 1$  can be true. This is a contradiction, implying the fact is true.

#### **4.2** Storing Augmenting Information for each Leaf

We shall describe this section in terms of augmenting information stored with each leaf. 315 However, one can easily see them as arrays that run parallel to the suffix array. We shall 316 show that each of these augmenting fields in all the cases can be stored in  $O(\log \sigma)$  bits. For 317 each leaf  $\ell_i$ , we can write in 2 bits which of the above 4 cases it belongs to. We denote this 318 by  $\mathsf{CASE}[i]$ . We also store the same value with i' and in this case we shall call it  $\overline{\mathsf{CASE}}[i']$ . 319 If  $\ell_i$  belongs to case (1b), then we intend to store e which we will denote as  $\mathsf{LCPC}[i] = e$ . 320 Recall that e is defined as the rightmost (maximum value) common change point for 321 T[r, r+d-1] and T[r', r'+d-1], and LCPC stands for last common point of change. Thus, 322 LCPC is an array whose *i*th entry corresponds to leaf  $\ell_i$ . However, storing the value *e* directly 323 will require  $\log n$  bits. Therefore, instead of e, we store number of distinct alphabet symbols 324 in T[r, r+e-1] (i.e.,  $\alpha(T[r, r+e-1])$ ). We will call this value  $\alpha \mathsf{LCPC}[i]$ . It is worth noting 325 that since change points only occur at new (first occurence) alphabets in the string, e can be 326 uniquely decoded from  $\alpha$ LCPC. We also store a complementary array of  $\alpha$ LCPC denoted as 327  $\overline{\alpha \mathsf{LCPC}}$  such that  $\overline{\alpha \mathsf{LCPC}}[i'] = \alpha \mathsf{LCPC}[i]$ . Thus, this value is not only stored with leaf *i* but 328 also replicated in leaf i' = LFS(i) - albeit under a differently named field. 329

Recall that for case (1a), g is the first change point after e for T[r', r' + d - 1]. For the case (1a), we store g which we call the first point of break FPB[i]. Again, we will not store the value g directly but an encoding  $\alpha(T[r, r + g - 1])$  which takes  $\log \sigma$  bits. We will call this value  $\alpha$ FPB[i]. Similarly, we store this value with i' as  $\overline{\alpha}$ FPB[i'] =  $\alpha$ FPB[i].

For the case (2a), we maintain  $\alpha \text{LCPC}$  and  $\overline{\alpha \text{LCPC}}$  as in case (1b). We also maintain an extra-bit EQBT indicating which type of change point LCPC is - whether equality change point (indicated by EQBT = 1) or not. Similarly, we also store  $\overline{EQBT}$ . We also store  $\alpha(T[r, r + d - 1])$  that is the number of distinct alphabet symbol occurring until LCP(*i*,*i*').

We shall call it  $\alpha \mathsf{LCP}[i]$ . Again, we store the same value at leaf  $\ell_{i'}$  so that  $\overline{\alpha \mathsf{LCP}[i']} = \alpha \mathsf{LCP}[i]$ . 338 Additionally to this, we store  $\mathsf{FPC}[i]$  (read as first point of change post LCA) which in 330 this case will be defined as the first change point of T[r, n] after T[r + d - 1]. Note that 340 this point of change cannot be right after LCA at T[r+d] because otherwise i will invert 341 over i' (this would then be case (2b) Lemma 8) during LF mapping operation and  $\mathsf{LF}(i)$ 342 will be greater than  $\mathsf{LF}(i')$ . Once again we define  $\overline{\mathsf{FPC}}[i'] = \mathsf{FPC}[i]$  and define  $\alpha \mathsf{FPC}[i]$  and 343  $\overline{\alpha \mathsf{FPC}}[i']$  in similar vein. In summary, we maintain  $\alpha \mathsf{LCPC}$ , EQBT,  $\alpha \mathsf{LCP}$  and  $\alpha \mathsf{FPC}$  for each 344 such leaf which falls in case (2a). We also store these values at their corresponding LF 345 successors. One point to note here is that FPC, LCPC, FPB are all uniquely decodable from 346  $\alpha$ FPC,  $\alpha$ LCPC,  $\alpha$ FPB since they necessarily fall on the new alphabet which is yet unseen in 347 the suffix. However, the same is not true of  $\alpha LCP$ . 348

As an example, let us look at T[r-1, n] = caghhfbab... and T[r'-1, n] = cagjjebae...349 Then, pred(T[r, n]) = 0111'456'2'... and pred(T[r', n]) = 0111'456'3'... Their LCPC is at 350 depth 5 which is encoded as 4 in the encodings of both the suffixes. Their  $\alpha LCPC = 4$ , since 351 there are 4 distinct alphabets in both the strings until that point (4 non-prime characters in 352 their pred encoding). Length of their LCP = 7, however the character **a** which occurs their as 353 encoded character 6' is not a new character. Hence,  $\alpha LCP = 5$  which points to character b in 354 both the original strings. If we try to decode  $\alpha LCP$ , it will lead us to position 6 rather than 355 7. Finally, after the LF mapping, the encoded strings are 00211'556'2' and 00211'556'3'. 356

For case (2b), our solution is more intricate so we only give a brief overview and defer details to Case (2b) section of the proof of correctness. In this case, i' inverts over i. Thus, i' has a change point right after the lca(i, i') at T[r' + d]. Just storing additional augmenting values to the leaves of the suffix tree is not sufficient. Like before, we shall store  $\alpha LCPC$  and  $\alpha LCP$  values. But we shall construct additional data structures called mini-trees and search for i' in an appropriate mini-tree identified by  $\alpha LCPC$  and  $\alpha LCP$  values of i. We will denote this mini-tree as  $\tau_{\alpha LCPC[i],\alpha LCP[i]}$ .

# 364 4.3 Query Algorithm

<sup>365</sup> Now, we outline the pseudo-code for our query algorithm.

### Computing LFS(i)

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If l<sub>i</sub> falls in case (1a), l<sub>i'</sub> is the unique leaf under u s.t. CASE[i'] = CASE[i] and αFPB[i'] = αFPB[i], where u is the highest ancestor of l<sub>i</sub> with αDepth(u) ≥ αFPB[i]
ElseIf l<sub>i</sub> falls in case (1b) l<sub>i'</sub> is unique leaf under u s.t. CASE[i'] = CASE[i] and αLCPC[i'] = αLCPC[i], where u is the highest ancestor of l<sub>i</sub> with αDepth(u) ≥ αLCPC[i]
ElseIf l<sub>i</sub> falls in case (2a) Let c = point above FPC[i] on suffix T[r, n] in the suffix tree. Then l<sub>i'</sub> is leftmost leaf after l<sub>i</sub> in the (subtree of αLCP[i]) \ (subtree of c) s.t. CASE[i'] = CASE[i], αLCPC[i] = αLCPC[i'], αLCPC[i'] and EQBT[i] = EQBT[i']
Else i' = findSucc(i, αLCPC[i], αLCP[i]), which is to be defined later

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Note that all the arrays mentioned above can be represented in  $O(n \log \sigma)$  bits, and the implementation uses standard succinct-data-structure techniques (see Section 4.5); the difficulty lies in proving the correctness of the algorithm, which is our focus next.

# **370** 4.4 Proofs of Correctness

We shall show correctness of each case. In each case, we need to ensure that we would not end up with a wrong answer. This could happen if there is another pair j, j' such that  $j' = \mathsf{LFS}(j)$  and this pair shares the same characteristics with the pair i, i'. In this case, pair j, j' may interfere in the search for i' leading to false answer j'.

# <sup>375</sup> 4.4.1 Case (1a)

Let c be the first point (the character within an edge of ST) on  $path(\ell_i)$  such that T[r, r +376 depth(c) - 1 has exactly  $\alpha FPB[i]$  distinct characters. Thus, this is the first (encoded) 377 character where  $\operatorname{pred}(T[r-1,n])$  and  $\operatorname{pred}(T[r'-1,n])$  differ; in other words,  $\operatorname{path}(\ell_{\mathsf{LF}(i)})$ 378 and  $path(\ell_{\mathsf{LF}(i')})$  bifurcate at the position given by depth(c) + 1. Let  $\hat{c}$  be the point in 379 ST such that  $path(\hat{c}) = pred(T[r-1, r + depth(c) - 1])$  and  $\hat{c'}$  be such that  $path(\hat{c'}) =$ 380  $\operatorname{pred}(T[r'-1, r'+\operatorname{depth}(c)-1])$ . These points are on sibling edges going down from the same 381 node. Let v be the node just above  $\hat{c}$  and  $\hat{c'}$ . For example, consider T[r-1, n] = jeabdh...382 and T[r'-1,n] = gfabdh... Then, path(c) = pred(abdh) = pred(fabdh) = 00114. This 383 makes  $path(\hat{c}) = pred(jeabdh) = 000114$ . However,  $path(\hat{c'}) = pred(gfabdh) = 000115$ . 384 Note that 5 is the highest encoded character (with an exception of 5') which branches out of 385 the node v. 386

<sup>387</sup> ► Lemma 9. There is only one pair of leaves i, i' in the subtree of c, such that  $\alpha$ FPB[i] = $<sup>388</sup> \overline{\alpha}$ FPB $[i'] = \alpha(T[r, r + depth(c) - 1]).$ 

**Proof.** Consider LF mapping of *i* and *i'*.  $path(\ell_{\mathsf{LF}(i)})$  and  $path(\ell_{\mathsf{LF}(i')})$  first bifurcate at points 389  $\hat{c}$  and  $\hat{c}'$  respectively. Since  $i' = \mathsf{LFS}(i)$ ,  $\mathsf{char}(\hat{c}) < \mathsf{char}(\hat{c}')$ . Moreover,  $\mathsf{char}(\hat{c}')$  is precisely 390 depth(c) or its equality version i.e. (depth(c))'. This is the highest (encoded) character, and 391 thus the branch with  $\hat{c'}$  will be one of the two rightmost branches among branches (depending 392 on whether the change point c for suffix i' was based on "equality" or not). However, the 393 point  $\hat{c}$  will certainly be before the two rightmost branches at v. If there was any other pair j 394 and j' of case (1a) under the subtree of c such that  $j' = \mathsf{LFS}(j)$  and  $\mathsf{FPB}(j) = \mathsf{FPB}(i)$ , then 395 both  $\mathsf{LF}(i')$  and  $\mathsf{LF}(j')$  will fall under the subtree of  $\hat{c'}$  because as per the LCPC lemma all 396 the change points of i' and j' are the same until c (including c). On the contrary,  $\mathsf{LF}(i)$  and 397  $\mathsf{LF}(j)$  cannot fall under this subtree as they are under the subtree of  $\hat{c}$ . Thus, depending on 398 whether  $\mathsf{LF}(i') < \mathsf{LF}(j')$  or not, only one pair out of  $(\mathsf{LF}(i), \mathsf{LF}(i'))$  or  $(\mathsf{LF}(j), \mathsf{LF}(j'))$  can be 399 adjacent. Since, i' is indeed the LF successor of i, such a pair j, j' cannot exist. 400

# 401 4.4.2 Case (1b)

Let c be the first point in ST on  $path(\ell_i)$  such that T[r, r + depth(c) - 1] has  $\alpha LCPC[i]$ distinct characters. In this case, c is a change point for both i and i'. For i', it is the equality change point while for i it is not (i.e., T[r'-1] = T[r' + depth(c) - 1] and  $T[r-1] \neq$ T[r+depth(c)-1]). Let point  $\hat{c}$  correspond to path(T[r-1, r+depth(c)-1]) and  $\hat{c'}$  correspond to path(T[r'-1, r' + depth(c) - 1]). Let v be the node right above  $\hat{c}$  (and also  $\hat{c'}$ ) which can be identified by path(v) = T[r-1, r+depth(c)-2]. In this case,  $\hat{c'}$  will fall in the rightmost branch at node v and  $\hat{c}$  will fall in the branch previous to that. The character at point  $\hat{c'}$  is precisely



**Figure 2** Illustration of case (2a)

the equality (prime) version of the character at  $\hat{c}$ . For example, consider T[r-1, n] = geabdh...409 and T[r'-1,n] = hfabdh... Then, path(c) = pred(abdh) = pred(fabdh) = 00114. This 410 makes  $path(\hat{c}) = pred(geabdh) = 000115$ . However,  $path(\hat{c}') = pred(hfabdh) = 000115'$ . 411 Here 5' is the highest encoded character. Again, as in the case (1a), if there were any other 412 pair j, j' falling in case (1b) under subtree of c such that LCPC(j) = LCPC(i), then LF(j')413 will also fall in the rightmost branch at v while  $\mathsf{LF}(j)$  will fall in the previous one. Again, by 414 applying simple interval logic as in case (1a), we can show that only one of the pairs can 415 satisfy the LF-successor definition. 416

# 417 4.4.3 Case (2a)

In this case, post lca(i,i'), branch with  $\ell_i$  is to the left of the branch with  $\ell_{i'}$ . Let c be the 418 point just above  $\mathsf{FPC}[i]$ . Let  $\ell_k$  be the rightmost leaf in the subtree of c. Note that since 419  $\mathsf{FPC}[i]$  is not immediately after the  $\mathsf{lca}(i, i')$ , the subtree of c does not include i'. Therefore, 420 the order between i and i' will not be inverted after taking LF mapping. Let f be the first 421 point in ST on suffix T[r, n] such that  $\alpha(\mathsf{path}(f)) = \alpha \mathsf{LCP}[i]$ . The actual  $\mathsf{LCP}[i]$  will be 422 somewhere in the subtree of f because LCP[i] is not uniquely decodable from  $\alpha$ LCP[i]. Here 423  $\mathsf{LCP}[i]$  denotes the  $\mathsf{lcp}(i, i')$ . Let j, j' be another pair in the subtree of f such that  $j' = \mathsf{LFS}(j)$ 424 and  $\alpha \mathsf{LCP}[j] = \alpha \mathsf{LCP}[i]$  and  $\mathsf{LCPC}[j] = \mathsf{LCPC}[i]$ . All four leaves  $\mathsf{LF}(i), \mathsf{LF}(i'), \mathsf{LF}(j), \mathsf{LF}(j')$ 425 will be in the subtree of  $\hat{f}$  which is the LF-image  $\mathsf{LF}(f, \mathsf{LCPC}[i], \mathsf{EQBT})$ . In other words,  $\hat{f}$ 426 is the locus of  $\operatorname{pred}(T[r-1, r + \operatorname{depth}(f) - 1])$  in ST. 427

Lemma 10. There does not exist a pair (j, j') such that j' = LFS(j),  $\alpha LCP[j] = \alpha LCP[i]$ , 429  $\alpha LCPC[j] = \alpha LCPC[i]$  and j' lies in between k and i'.

**Proof.** Consider any other pair j, j' in the subtree of f and with the same  $\alpha$ LCPC, EQBT and  $\alpha$ LCP values such that k < j' < i'. We will show by contradiction that such a j'cannot exist. Firstly, since i < k < j' and  $\ell_k$  being the rightmost leaf in the subtree of c, i cannot invert over j' after taking LF mapping. This is because c is the point just above FPC[i]. Hence LF(i) < LF(j'). Also, since LF(i') = LF(i) + 1, LF(j') must be greater than LF(i'). Secondly, the pair j, j' falls under case (2a) where j < j' and LF(j) < LF(j'). Thus, LF(i')  $\leq$  LF(j) < LF(j') which means both j and j' invert over i' after LF operation.

<sup>437</sup> Next, j < j' < i' means lca(j,i') is equal to or above lca(j',i'). Since j and j' invert over i', <sup>438</sup> it must be at lca(j,i') and lca(j',i') respectively. If lca(j,i') is above lca(j',i'), then j inverts

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**Figure 3** Illustration of case (2a) (left) and case (2b) (right). Red underline shows the character encoding that changes after taking LF.

above j' and it implies  $\mathsf{LF}(j) > \mathsf{LF}(j')$  which is a contradiction. Now if  $\mathsf{lca}(j,i') = \mathsf{lca}(j',i')$ , 439 then there are two cases. The first case is where j and j' invert from a common branch 440 connecting path of i'. Here, j and j' will have a common change point at this branch which 441 is post lca(j', i'). It implies that there is another common change point for j, j' which leads 442 to LCPC[j] > LCPC[i] (a contradiction). In the second case, j and j' branch out at lca(j',i')443 but fall in different branches. However, according to Lemma 8, only one of j or j' can have a 444 change point right after the lca(i, i'). Hence, this case also leads to contradiction. Thus, j' 445 does not lie in between k and i' (See Figure 3). 446

### 447 4.4.4 Case (2b)

For the case (2b), we know that suffix i' comes before suffix i in the suffix tree, i.e. i' < i. Additionally, for the case (2b), i' has a change point right after the node representing the  $\mathsf{lca}(i,i')$ . Moreover, under  $\mathsf{lca}(i,i')$  the branch containing the suffix i' will be the only one that will have a change point tied with the same LCPC (See Fact 1). Since  $i' = \mathsf{LFS}(i)$ , after the LF mapping i' will invert over i making  $\mathsf{LF}(i') = \mathsf{LF}(i) + 1$ .

As mentioned in Section 4.2, for the case (2b) we store  $\alpha \mathsf{LCPC}[i]$  and  $\alpha \mathsf{LCP}[i]$  values for 453 each leaf  $\ell_i$  as augmenting information. Additionally, we store their complements  $\overline{\alpha \mathsf{LCPC}}[i']$ 454 and  $\overline{\alpha \text{LCP}}[i']$  for each leaf  $\ell_{i'}$ . Now we consider an additional data structure called mini-455 trees that will help us in finding i' given i. Specifically, a particular mini-tree  $\tau_{a,b}$  has 456 set of all leaves  $\ell_i$  and their corresponding LF successors  $\ell_{i'}$  from the suffix tree that has 457  $\alpha \mathsf{LCPC}[i] = \overline{\alpha \mathsf{LCPC}}[i'] = a$  and  $\alpha \mathsf{LCP}[i] = \overline{\alpha \mathsf{LCP}}[i'] = b$ . A particular leaf  $\ell_i$  will not be in 458 any mini-tree if that leaf does not fall under the case (2b). Thus, a leaf can be present in 459 a mini-tree if it falls under case (2b) or it is an LF-successor of some other leaf which falls 460 under the case (2b). Therefore, each leaf in the suffix tree will be in at most two mini-trees 461 and some mini-trees are possibly empty. In other words, a mini-tree is a compacted subtrie 462 of the suffix tree containing only those leaves selected for that mini-tree. Hence, overall size 463 of all the mini-trees combined is O(n). 464

To draw a correspondence between the leaves of the suffix tree and the leaves of the mini-trees, we use a bit-vector B[1, n], where B[i] = 1 iff leaf *i* falls in case (2b) or leaf *i* is an LF-successor of the leaf which falls in case (2b). In other words, B[i] = 1 if a leaf from the suffix tree is present in at least one of the mini-trees, and B[i] = 0 otherwise. Next, we create two character vectors *C* and  $\overline{C}$  as follows. If B[i] = 0, then  $C[i] = \overline{C}[i] = 0$ . Otherwise,

1. C[i] stores an encoding of the pair  $\alpha \mathsf{LCPC}[i], \alpha \mathsf{LCP}[i]$  as a combined character from an alphabet of size  $\sigma^2$ ; essentially  $C[i] = (\sigma - 1) \cdot \alpha \mathsf{LCPC}[i] + \alpha \mathsf{LCP}[i]$ 

<sup>472</sup> **2.**  $\overline{C}[i] = -C[i]$  if  $\alpha \text{LCPC}[i] = \overline{\alpha \text{LCPC}}[i]$  and  $\alpha \text{LCP}[i] = \overline{\alpha \text{LCP}}[i]$ , and  $\overline{C}[i] = (\sigma - 1) \cdot \overline{\alpha \text{LCPC}}[i] + \overline{\alpha \text{LCPC}}[i] + \overline{\alpha \text{LCPC}}[i]$  otherwise.

Now given a particular leaf  $\ell_i$  in the suffix tree, for finding the corresponding leaf in the 474 mini-tree, we first check if B[i] = 1. Since  $a = \alpha \mathsf{LCPC}[i]$  and  $b = \alpha \mathsf{LCP}[i]$ , we can quickly 475 identify the mini-tree  $\tau_{a,b}$  it belongs to as augmenting information  $\alpha \mathsf{LCPC}[i]$  and  $\alpha \mathsf{LCP}[i]$ 476 is stored for the leaf  $\ell_i$ . To find out which leaf in  $\tau_{a,b}$  corresponds to  $\ell_i$ , all we have to do 477 is figure out the number of leaves  $j \leq i$  that satisfy  $a = \alpha \mathsf{LCPC}[j] = a$  and  $b = \alpha \mathsf{LCP}[j]$ 478 or  $\overline{\alpha \mathsf{LCPC}}[j] = a$  and  $\overline{\alpha \mathsf{LCP}}[j] = b$ ; this is the same as the number of entries  $j \leq i$  in the 479 character vectors C such that C[j] = C[i] plus the number of entries  $k \leq i$  in the character 480 vectors  $\overline{C}$  such that  $\overline{C}[k] = C[i]$ . This is because the mini-tree is just a compacted subtrie 481 of the original suffix tree consisting of only those leaves present in a particular mini-tree. 482 To map a leaf from the mini-tree back to the leaf of the original suffix tree, we need to 483 store a character vector for each mini-tree over the leaves of the mini-tree. Let  $C_{a,b}$  be the 484 character vector for the mini-tree  $\tau_{a,b}$ . This character array indicates whether the leaf has 485  $a = \alpha \mathsf{LCPC}[i]$  and  $b = \alpha \mathsf{LCPC}[i]$  or  $a = \alpha \mathsf{LCPC}[i]$  and  $b = \alpha \mathsf{LCPC}[i]$  or both. In other words, it 486 simply specifies how the leaf was selected for that mini-tree using techniques similar to that 487 described above. It is to be noted that all character vectors combined need  $O(n \log \sigma)$  bits. 488

#### 489 4.4.4.1 Identifying i'

We know that  $\alpha \mathsf{LCPC}[i] = a$  and  $\alpha \mathsf{LCP}[i] = b$ . Let  $p_a$  be the first point in suffix tree where 490  $\alpha(T[r + \mathsf{depth}(p_a) - 1])) = a$  and  $p_b$  be the first point such that  $\alpha(T[r + \mathsf{depth}(p_b) - 1]) = b$ . 491 Thus,  $p_a$  and  $p_b$  are the points in suffix tree where  $\alpha \mathsf{LCPC}[i]$  and  $\alpha \mathsf{LCP}[i]$  are located. Note 492 that  $p_a$  is above or the same as  $p_b$ . Now consider the mini-tree  $\tau_{a,b}$ . Let another pair j, j'493 where  $j' = \mathsf{LFS}(j)$  fall under the same mini-tree (i.e.,  $\ell_j$  and  $\ell'_j$  are also descendants of  $p_b$ 494 and  $\alpha \mathsf{LCPC}[j] = \alpha \mathsf{LCPC}[i]$  and  $\alpha \mathsf{LCP}[j] = \alpha \mathsf{LCP}[i]$ . Here j' will be on the left of j because 495 they fall under the case (2b). We will focus here on searching i' as the first qualifying leaf to 496 the left of i. Another pair j, j' could interfere with our process of searching if j' falls between 497 i' and i. Formally, we say 498

▶ Definition 11. A pair j, j' interferes with i, i' if i' < j' < i and  $\alpha \text{LCPC}[j] = \alpha \text{LCPC}[i]$  and  $\alpha \text{LCP}[j] = \alpha \text{LCP}[i]$ . Here, i' = LFS(i) and j' = LFS(j)

There are two cases of 'interference' that can occur with respect to these two pairs – 501 case (2b') is where both j' and j are in between i' and i i.e. i' < j' < j < i and case (2b\*) 502 where j is on the right of i i.e. i' < j' < i < j. As we know that  $\alpha \mathsf{LCPC}[i] = \alpha \mathsf{LCPC}[j] = a$ 503 and  $p_a$  is the first point in the suffix tree where  $\alpha(T[r + \mathsf{depth}(p_a) - 1])) = a$ . Suppose 504  $x = \mathsf{LF}(\mathsf{lca}(i,i'), p_a, EQBT)$  and  $y = \mathsf{LF}(\mathsf{lca}(j,j'), p_a, EQBT)$ . Here EQBT is set to 1 if i' 505 has an equality change point and 0 otherwise. Now in the case (2b'), after taking LF-mapping, 506 j' inverts over j under y and i' inverts over all three of j, j', i under x – we call this the nested 507 case. In case (2b<sup>\*</sup>), j' and i both together (maintaining same order) invert over j under y 508 and then i' inverts over all of them under x – we call this the bulk-invert case. Additionally, 509 we will need to augment this mini-tree further so that we can distinguish the pair i, i' from 510 the pair j, j'. 511

▶ Lemma 12. If a pair j, j' interferes with i, i', then lca(i', i) occurs above lca(j', j) in the suffix tree. Additionally, if i < j, then lca(j', i) is below lca(j, j').

**Proof.** Note that in bulk invert case since j' and i both invert together over j, lca(j', i) must be below lca(j, j'). Even though  $\alpha LCP[i] = \alpha LCP[j]$ , it cannot happen that LCAs of both the pairs are on the same node in the suffix tree (i.e. lca(i', i) = lca(j', j)). This is because from any node only one branch can have a change point at the next character below the node (see Fact 1). But we know that i' has a change point just below the node representing

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**Figure 4** Mini-trees for case (2b)

lca(i,i'). Therefore, the branch containing j' cannot have a change point just below that 519 node. This implies  $j' \neq \mathsf{LFS}(j)$  since j falls under the case (2b). This holds a contradiction. 520 Therefore, for the case (2b'), it must be the case that lca(i', i) is below lca(i', i), implying 521 that suffixes j' and j belong to the subtree at lca(i', i). In case (2b\*), it cannot happen 522 that lca(i', i) is below lca(j', j) because that would mean j' has a change point right below 523  $\mathsf{lca}(i', i)$  which falls above  $\mathsf{lca}(i', i)$ . This would make  $\alpha \mathsf{LCPC}[i]$  different than  $\alpha \mathsf{LCPC}[i]$ 524 because the suffixes i and i' will have an extra change point above lca(i, i') and below the 525 lca(j, j'). Hence, for the case (2b<sup>\*</sup>) this leads to a contradiction and lca(j, j') cannot be 526 above the lca(i, i'). 527

If lca(i', i) and lca(j', j) are not on the same root-to-leaf path (neither above nor below nor same as each other), then pairs i, i' and j, j' are non-interfering. So we need not consider that case as in some sense for i, our algorithm looks at the closest suffix to the left of i that has the same  $\alpha LCPC$  and  $\alpha LCPC$  as the qualifying suffix for LFS(i).

Finally, from Fact 1 we can say that there exists a unique suffix i' marked with case (2b) under the point at 1 + depth(lca(i', i)) depth such that  $\alpha \text{LCP}[i] = \overline{\alpha \text{LCP}}[i']$  and  $\alpha \text{LCPC}[i] = \frac{\alpha}{\alpha} \frac{1}{\alpha} \frac{1$ 

### 535 4.4.4.2 Searching in Minitree

For any i, if we can identify lca(i',i) precisely, then i' is the leaf which has the same  $\alpha LCPC$ 536 and  $\alpha LCP$  values (as that of i) and i' is in the subtree of a branch of lca(i', i) whose leading 537 character in that branch is a change point. For this, we mark some nodes in the tree. More 538 precisely, for each mini-tree, we mark a node v if a point at (depth(parent(v)) + 1) depth is a 539 change point for a suffix i' (in case (2b)) in the subtree of v. Note that only one child of 540 a node can get marked (refer to Fact 1). Also note that there is only one marked node in 541 a path from the root to a leaf because if there were another marked node w for a suffix j', 542 then  $\alpha \mathsf{LCPC}[i'] \neq \alpha \mathsf{LCPC}[j']$ . But we know that all the leaves in a mini-trie have the same 543  $\alpha \mathsf{LCPC}[i], \alpha \mathsf{LCP}$  (or their complement) values. 544

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Now lets say that a node x in the mini tree  $\tau_{\alpha LCPC[i],\alpha LCP[i]}$  is the node corresponding 545 to lca(i', i) in the suffix tree. Therefore, given i, our task simply becomes locating the leaf 546  $\ell$  in the mini-tree that corresponds to *i*. Then, find the lowest ancestor of  $\ell$  that has a 547 marked child before  $\ell$  in pre-order; observe that this lowest ancestor is precisely the node 548 x corresponding to lca(i', i). Let y be the marked child of x. Within the subtree of y, we 549 can find the unique leaf  $\ell'$  corresponding to i', which can be mapped back to the original 550 suffix tree. To find this unique leaf, we store a unary encoding at the marked node indicating 551 which leaf we looking for; more precisely, if the desired leaf is the  $z^{th}$  leftmost leaf under 552 the marked node, then store z in unary at the marked node. Since there is only one marked 553 node from a leaf to root path in a mini-tree, the total length of all such unary encodings 554 combined is bounded by the size of the mini-tree. The mapping to and from the suffix tree to 555 a mini-tree can be carried out using the bit-vector and the character vectors defined earlier. 556 For the sake of completion, we summarize the discussion in the following findSucc method, 557 which was used by pseudo-code in Section 4.3. 558

# findSucc(i, a, b)

- Use the bit-vector B and the character vectors C and  $\overline{C}$  to identify the leaf  $\ell$  in  $\tau_{a,b}$  that corresponds to  $\ell_i$
- Find the lowest ancestor x of  $\ell$  that has a marked child y before x in pre-order
- Use the unary encoding stored at y to locate the leaf  $\ell'$  in  $\tau_{a,b}$  corresponding to  $\ell_{i'}$
- Finally, use the character vector  $C_{a,b}$  to map  $\ell'$  back to i'

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# **4.5** Implementation and Complexity Analysis

- <sup>561</sup> We will rely on the following well-known data structures of Fact 2 and Fact 3.
- **Fact 2** (Wavelet Tree [11]). Given an array A[1,t] over  $\Sigma$ , by using a  $t \log |\Sigma| + o(t \log |\Sigma|)$ -
- bit structure, we can compute the following in  $O(\log |\Sigma|)$  time:

564  $\blacksquare$  A[i]

- so  $\operatorname{rank}_A(i, x) = number of occurrences of x in A[1, i]$
- select<sub>A</sub>(i, x) = i-th occurrence of x in A
- prevValue<sub>A</sub> $(i, y) = rightmost position j < i such that A[j] \le y$
- 568 We drop the subscript A when the context is clear.
- **Fact 3** (Fully-Functional Succinct Tree [19]). The topology of order-isomorphic suffix tree can be encoded in O(n) bits to support the following operations in O(1) time.
- $_{571}$  = pre-order(u)/post-order(u): pre-order/post-order rank of node u
- $_{572}$  **parent**(u): parent of node u
- nodeDepth(u): number of edges on the path from the root to u
- 574  $\blacksquare$  child(u,q): qth leftmost child of node u
- sibRank(u): number of children of parent(u) to the left of u
- Ica(u, v): lowest common ancestor (LCA) of two nodes u and v
- sp(u)/ep(u): leftmost/rightmost leaf in the subtree of u
- <sup>578</sup> levelAncestor(u, d): ancestor of u such that nodeDepth(u) = d

Moving forward, we assume that any array has been pre-processed using Fact 2. We maintain the topology of the order-isomorphic suffix tree and the mini-trees (Case 2b) using Fact 3. Finally, we explicitly store  $\alpha \text{Depth}(u)$  for every node u in the order-isomorphic suffix

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tree. For the purpose of locating the node immediately below FPB or LCPC, we will rely on the following lemma.

▶ Lemma 13. By maintaining an  $O(n \log \sigma)$  bit data structure, given a leaf  $\ell_i$  and an integer W, we can find the highest ancestor w of  $\ell_i$  satisfying  $\alpha$ Depth $(w) \ge W$  in  $O(\log \sigma)$  time.

**Proof.** Create an array A such that  $A[k] = \alpha \text{Depth}(w)$ , where w is the node with pre-order rank k. Maintain A as a wavelet tree. Given  $\ell_i$ , find the rightmost entry  $r < \text{pre-order}(\ell_i)$  in A such that A[r] < W using  $\text{prevValue}_A(\text{pre-order}(\ell_i), W-1)$ . Let  $v' = \text{lca}(\ell_i, v)$ , where v is the node with pre-order rank r. Then,  $w = \text{levelAncestor}(\ell_i, \text{nodeDepth}(v')+1)$ . To see why this is correct, observe that  $\alpha \text{Depth}(v') \le \alpha \text{Depth}(v) < W$ . If  $\alpha \text{Depth}(w) < W$ , the prevValue-queryshould have returned w instead of v (since  $\text{pre-order}(v) < \text{pre-order}(w) \le \text{pre-order}(\ell_i)$ ).

# <sup>592</sup> 4.5.1 Case (1a) and Case (1b)

<sup>593</sup> In case (1a), i' is the only leaf marked with case (1a) in the sub-tree of FPB(i) that satisfies <sup>594</sup>  $\overline{\alpha \text{FPB}[i']} = \alpha \text{FPB}[i]$ . The first task is to find the subtree of FPB(i), i.e., the node just below <sup>595</sup> FPB(i). This node, say v, can be found in  $O(\log \sigma)$  time using Lemma 13 and by using <sup>596</sup>  $\alpha \text{FPB}[i]$ . Within the subtree of v, we simply find the only leaf i' marked with 1a such that <sup>597</sup>  $\overline{\text{FPB}}[i'] = \text{FPB}[i]$  using Fact 2. Since  $\alpha \text{FPB}$  and  $\overline{\alpha \text{FPB}}$  entries for case (1a) suffixes are at <sup>598</sup> least one, in order to identify a valid case (1a) suffix, we simply set the  $\alpha \text{FPB}$  and  $\overline{\alpha \text{FPB}}$ <sup>599</sup> entries for non case (1a) suffixes to zero.

In case (1b), the idea is the same, with the difference that we use  $\alpha$ LCPC and  $\overline{\alpha}$ LCPC arrays (instead of FPB and  $\alpha$ FPB arrays) for finding the node v and then i'. As in the previous case, we set the  $\alpha$ LCPC and  $\overline{\alpha}$ LCPC entries for non case (1b) suffixes to zero.

Note that the wavelet trees for the four arrays need  $O(n \log \sigma)$  bits, and a wavelet tree query needs  $O(\log \sigma)$  time.

### <sup>605</sup> 4.5.2 Case (2a)

Let c be the point just above  $\mathsf{FPC}[i]$ . Let  $\ell_k$  be the rightmost leaf in the subtree of c. By Lemma 10, it is evident that i' is the leftmost leaf such that i' > k,  $\overline{\alpha \mathsf{LCP}}[i'] = \alpha \mathsf{LCP}[i]$ ,  $\overline{\alpha \mathsf{LCPC}}[i'] = \alpha \mathsf{LCPC}[i]$ , and  $\overline{\mathsf{EQBT}}[i'] = \mathsf{EQBT}[i]$ . To properly identify a case (2a) suffix, we maintain a summary vector X defined as follows. For any suffix i lying in case (2a),  $X[i] = (\sigma - 1) \cdot \alpha \mathsf{LCP}[i] + \alpha \mathsf{LCPC}[i]$  if  $\mathsf{EQBT}[i] = 1$ , and  $X[i] = -(\sigma - 1) \cdot \alpha \mathsf{LCP}[i] - \alpha \mathsf{LCPC}[i]$ if  $\mathsf{EQBT}[\underline{i}] = 0$ . For any suffix j not in case (2a), we let X[i] = 0. Likewise, we define  $\overline{X}$ based on  $\overline{\alpha \mathsf{LCPC}}$ ,  $\overline{\alpha \mathsf{LCPC}}$ , and  $\overline{\mathsf{EQBT}}$ .

Note that any entry in X and  $\overline{X}$  is from the set  $[0, 2\sigma^2]$ ; hence, a wavelet over them needs  $O(n \log \sigma)$  bits and supports queries in  $O(\log \sigma)$  time. Thus, if we can find out the leaf  $\ell_{k}$ , we can locate i' by using the wavelet-tree over the two summary vectors X and  $\overline{X}$  in additional  $O(\log \sigma)$  time.

To find  $\ell_k$ , we use Lemma 13 and  $\alpha$ FPB to first find the highest node v such that  $\alpha$ Depth $(v) \geq \alpha$ FPB[i]. Note that  $\ell_k$  is the rightmost leaf in the subtree of parent(v) if FPB[i]is the first character of the edge on which it lies, and is the rightmost leaf in the subtree of votherwise. We explicitly store a bit-vector to distinguish between the cases. Using these,  $\ell_k$ is located in  $O(\log \sigma)$  time.

# <sup>622</sup> 4.5.3 Case (2b)

In our previous discussion, we have already addressed how to map a case (2b) leaf i in the suffix tree to its corresponding leaf in the mini-tree. (Refer to Section 4.4.4.) We have also

addressed that given the desired marked node (corresponding to i) in the mini-tree, how we can find the leaf in the mini-tree corresponding to the LF-successor i'. Finally, we also know how to map-back to i' from the mini-tree. Note that all of these can be achieved by storing the character vectors and the bit vector as a wavelet tree, and by using a succinct encoding of the mini trees. What is left to discuss is how to find the marked node. To this end, we present Lemma 14. Using this we can find the desired marked node in O(1) time given the leaf corresponding to i in the mini-tree.

▶ Lemma 14. Consider a tree having t nodes, where each non-leaf node has at least two children. Also, each node is marked or unmarked. By using an O(t)-bit data structure, given a leaf x, in O(1) time, we can find the rightmost leaf y < x such that the child of lca(y, x) on the path to y is marked.

<sup>636</sup> **Proof.** Let u be a node. We *associate* 1 with u iff parent(u) has a child v before u in pre-order, <sup>637</sup> where v is marked. Pre-process the tree with Lemmas 15 and 16.

Given the query x, use Lemma 15 to locate the lowest ancestor u of x associated with a 1. We find the marked sibling v of u to its left using Lemma 16. The time needed is O(1).

**Lemma 15.** Consider a tree having t nodes, where each non-leaf node has at least two children. Also, each node is associated with a 0 or 1. By using an O(t)-bit data structure, in O(1) time, we can find the lowest ancestor of a leaf that is associated with a 1.

**Proof.** Starting from the leftmost leaf, every  $g = c \log t$  leaves form a group, where c is a 643 constant to be decided later. (The last group may have fewer than q leaves.) Mark the lca of 644 the first and last leaf of each group. At each marked node, write the node-depth of its lowest 645 ancestor which is associated with a 1. The space needed is  $O(\frac{t}{a} \log t) = O(t)$  bits. Let  $\tau_u$  be 646 the subtree rooted at a marked node u. Since each node in  $\tau_u$  is associated with a 0 or 1, the 647 number of possible trees is at most  $2^g$  (because  $\tau_u$  has fewer than g non-leaf nodes). We store 648 a pointer from u to  $\tau_u$ . The total space needed for storing all pointers is  $O(\frac{t}{a} \log 2^g) = O(t)$ 649 bits. For each possible  $\tau_u$ , store the following satellite data in an additional array. Consider 650 the kth leftmost leaf  $\ell_k$  in  $\tau_u$ . Let v be the lowest node on the path from u to  $\ell_k$  associated 651 with a 1. If v exists, store the node-depth of v relative to u, else store -1. The space needed 652 for each  $\tau_u$  is  $O(g \log g) = O(g \log \log t)$  bits. Therefore, the total space for all such trees is 653  $O(2^{g}g \log \log t)$ . By choosing c = 1/2, this space is bounded by o(t) bits. Thus, the total 654 space is bounded by O(t) bits. 655

Given a query leaf  $\ell_k$ , we first locate the lowest marked node  $u^* = lca(1+g\lfloor k/g \rfloor, max\{t, g(1+ \lfloor k/g \rfloor)\})$  of  $\ell_k$ . Let  $d^*$  be the depth stored at  $u^*$ . Let  $k' = k - g\lfloor k/g \rfloor$ . Check the k'th entry of the satellite array of  $u^*$ , and let it be d. If d = -1, then assign  $D = d^*$ , else assign  $D = nodeDepth(u^*) + d$ . The lowest ancestor of  $\ell_k$  associated with a 1 is given by levelAncestor( $\ell_k, D$ ).

**Lemma 16.** Consider a tree of t nodes, where some nodes are marked. By using an O(t)-bit data structure, in O(1) time, given a node v, we can find a node u (if any) such that u is the rightmost marked child of parent(v) and pre-order(u) < pre-order(v).

**Proof.** For each node w, we store a bit-vector  $B_w[t_w]$ , where  $t_w$  is the number of children of w. Assign  $B_w[i] = 1$  iff the  $i^{th}$  leftmost child of w, given by child(w, i), is marked. The total space needed is O(t) bits. Given the query node v, we go to the bit vector  $B_{v'}$ , where v' = parent(v). Let  $r = rank_{B_{v'}}(sibRank(v), 1)$ . If r = 0, then u does not exist; otherwise,  $u = child(v', select_{B_{v'}}(r, 1))$ .

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