

Dismantling DivSufSort[★]

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Abstract. We give the first concise description of the fastest known suffix sorting algorithm in main memory, the *DivSufSort* by Yuta Mori. We then present an extension that also computes the LCP-array, which is competitive with the fastest known LCP-array construction algorithm.

Keywords: text indexing; suffix sorting; algorithm engineering

1 Introduction

The suffix array [12] is arguably one of the most interesting and versatile data structure in stringology. Despite the plethora of theoretical and practical papers on suffix sorting (see the two overview articles [3, 18] for an overview up to 2007/2012), the text indexing community faces the curiosity that the fastest and most space-conscious way to construct the suffix array is by an algorithm called *DivSufSort* (coded by Yuta Mori), which has only appeared as (almost undocumented) source code, and has never been described in an academic context. The speed and its space-consciousness make DivSufSort still the method of choice in many software systems, e.g. in bioinformatics libraries¹, and in the *succinct data structures library (sdsl)* [5].

The starting point of this article was that we wanted to get a better understanding of DivSufSort’s functionality and the reasons for its advantages in performance, but we could not find any arguments for this neither in the literature nor in the documentation. We therefore dove into the source code (consisting of more than 1,000 LOCs) ourselves, and want to communicate our findings in this article. We point out that just very recently Labeit et al. [10] parallelized DivSufSort, making it also the fastest *parallel* suffix array construction algorithm (on all instances but one). We think that this successful parallelization adds another reason for why a deeper study of DivSufSort is worthwhile.

Our Contributions and Outline. This article pursues two goals: First, it gives a concise description of the DivSufSort-algorithm (Sect. 3), so that readers wishing to understand or modify the source code have an easy-to-use reference at hand. Second (Sect. 4), we provide and describe our own enhancement of DivSufSort that also computes related and equally important information, the array of longest common prefixes of lexicographically adjacent suffixes (*LCP-array* for short). We test our implementation empirically on a well-accepted testbed and prove it competitive with existing implementations, sometimes even little faster.

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¹ <https://github.com/NVlabs/nvbio>, last seen 05.07.2017

i	0	1	2	3	4	5	6	7	8	9	10	11	12
$T[i]$	c	d	c	d	c	d	c	d	c	c	d	d	\$
type(i)	B*	A	B*	A	B*	A	B*	A	B	B*	A	A	A

Figure 1: Classification of $T = \text{cdcdcdcdccdd}\$$ (our running example).

To help the reader link our description to the implementation, we show relevant excerpts from the original code², along with their original line numbers in the source code (`difsufsort.c`, `sssort.c`, and `trsort.c`). In the following, we use a slanted font for variables that also appear verbatim in the source code; e.g., T for the text.

2 Preliminaries

Let $T = T[0]T[1]\dots T[n-1]$ be a *text* of length n consisting of characters from an ordered *alphabet* Σ of size $\sigma = |\Sigma|$. For integers $0 \leq i \leq j \leq n$, the notation $[i, j)$ represents the integers from i to $j-1$, and $T[i, j)$ the *substring* $T[i] \dots T[j-1]$. We call $S_i = T[i, n)$ the i -th *suffix* of T . The *suffix array* SA of a text T of length n is a permutation of $[0, n)$ such that $S_{\text{SA}[i]} < S_{\text{SA}[i+1]}$ for all $0 \leq i < n-1$. In SA , all suffixes starting with the same character $c_0 \in \Sigma$ form a contiguous interval called c_0 -*bucket*. The same is true for all suffixes starting with the same two characters $c_0, c_1 \in \Sigma$. We call the corresponding intervals (c_0, c_1) -*buckets*. The *inverse suffix array* ISA is the inverse permutation of SA . The *longest common prefix* of two suffixes S_i and S_j is $\text{lcp}(i, j) = \max\{s \geq 0: T[i, i+s) = T[j, j+s)\}$. The *longest common prefix array* LCP of T contains the longest common prefixes of the lexicographically consecutive suffixes, i.e., $\text{LCP}[0] = 0$ and $\text{LCP}[i] = \text{lcp}(\text{SA}[i-1], \text{SA}[i])$ for all $1 \leq i \leq n-1$.

We classify all suffixes as follows (a technique first introduced by [7]; see Figure 1). The suffix S_i is an A-suffix (or “ S_i has type A”) if $T[i] > T[i+1]$ or $i = n-1$. If $T[i] < T[i+1]$, then S_i is a B-suffix (or “has type B”). Last, if $T[i] = T[i+1]$ then S_i has the same type as S_{i+1} .³ We further distinguish B-suffixes: if S_i has type B and S_{i+1} has type A, then suffix S_i is also a B*-suffix. Note that there are at most $\frac{n}{2}$ B*-suffixes. The definition of types implies restrictions on how the suffixes are distributed within one bucket: A (c_0, c_1) -bucket cannot contain A-suffixes if $c_0 < c_1$, and it cannot contain B-suffixes if $c_0 > c_1$. If $c_0 = c_1$ it cannot contain B*-suffixes. The classification also induces a partial order among the suffixes (see also Fig. 2):

Lemma 1. *Let S_i and S_j be two suffixes. Then*

1. $S_i < S_j$ if S_i has type A, S_j has type B and $T[i] = T[j]$, and
2. $S_i < S_j$ if S_i has type B*, S_j has type B but not type B* and $T[i, i+1) = T[j, j+1)$.

Proof. A- and B-suffixes can only occur together in a (c_0, c_0) -bucket. Assume that S_i and S_j start with c_0c_0 followed by a (possibly empty) sequence of c_0 's and S_i, S_j have type A, B, resp. Let $u = T[i + \text{lcp}(i, j)]$ and $v = T[j + \text{lcp}(i, j)]$ be the first characters where the suffixes differ. Therefore, $u \leq c_0$ and $v \geq c_0$. Since the characters differ, at least one of the inequalities is strict. The argument for the second case works analogously. \square

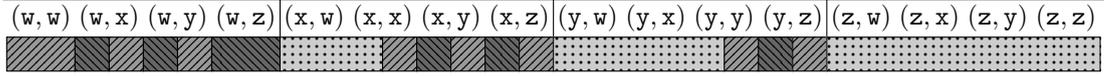


Figure 2: Position of the suffix types within the (c_0, c_1) -buckets for $\Sigma = \{w, x, y, z\}$. Light gray (▤) areas represent positions of A-suffixes, gray (▥) areas represent positions of B-suffixes, and dark gray (▦) areas represent positions of B*-suffixes.

Given two consecutive B*-suffixes S_i and S_j (i.e., there is no B*-suffix S_k such that $i < k < j$), we call the substring $T[i, j + 2)$ *B*-substring*. Also, for the last B*-suffix S_i (i.e., there is no B*-suffix S_k with $i < k < n$), the substring $T[i, n)$ is also called a B*-substring.

3 DivSufSort

In this section we describe DivSufSort based on its current implementation (libdivsufsort v2.0.2). The algorithm consists of three phases:

- First, we identify the types of all suffixes and compute the corresponding c_0 - and (c_0, c_1) -bucket borders. This requires one scan of the text.
- Next, we sort all B*-suffixes and place them at their correct position in SA. This is the most complicated part, as we first have to sort the B*-substrings in-place. Then, we use the ranks of the sorted B*-substrings to sort the corresponding B*-suffixes.
- In the last step, we scan SA twice to induce the correct position of all remaining suffixes. (We first scan from right to left to induce all B-suffixes, followed by a scan from left to right, inducing all A-suffixes.)

Throughout the computation we utilize two additional arrays to store information about the buckets: `BUCKET_A` (for A-suffixes) and `BUCKET_B` (for B- and B*-suffixes) of size σ and σ^2 , resp. The former is used to store values associated with A-suffixes and is accessed by only one character. The latter is used to store values associated with B- and B*-suffixes and is accessed by two characters. `BUCKET_B[c0, c1]` is short for `BUCKET_B[|c0| · σ + |c1|]` and `BUCKET_BSTAR[c0, c1]` is short for `BUCKET_B[|c1| · σ + |c0|]`, where $|\alpha|$ denotes the rank of α in the alphabet Σ . Information about both suffixes can be stored in the same array (Figure 3), as there are no B*-suffixes in (c_0, c_0) -buckets and no B-suffixes in (c_0, c_1) -buckets for $c_0 > c_1$. We denote the number of B*-suffixes by m .

	a	b	c	d	e	...	z
a	▦	▦	▦	▦	▦	▦	▦
b	▦	▦	▦	▦	▦	▦	▦
c	▦	▦	▦	▦	▦	▦	▦
d	▦	▦	▦	▦	▦	▦	▦
e	▦	▦	▦	▦	▦	▦	▦
⋮							
z							

Figure 3: `BUCKET_B` (gray) and `BUCKET_BSTAR` represented as a 2-dimensional array.

3.1 Initializing DivSufSort

The initialization of DivSufSort is listed in `divsufsort.c`. First, we scan T from right to left (line 60), determine the type of each suffix and store the sizes of the corresponding

² <https://github.com/y-256/libdivsufsort>, last seen 05.07.2017

³ This differs from [7], where S_i is always a B-suffix if $T[i] = T[i + 1]$.

													\$ c d (c,c) (c,d)						
i	0	1	2	3	4	5	6	7	8	9	10	11	12	BUCKET_A	1	0	6	-	-
$T[i]$	c	d	c	d	c	d	c	d	c	c	d	d	\$	BUCKET_B	-	-	-	1	-
$SA[i]$	0	0	0	0	0	0	0	0	0	0	2	4	6	9	BUCKET_BSTAR	-	-	-	5
(a)													(b)						
													\$ c d (c,c) (c,d)						
i	0	1	2	3	4	5	6	7	8	9	10	11	12	BUCKET_A	0	1	7	-	-
$T[i]$	c	d	c	d	c	d	c	d	c	c	d	d	\$	BUCKET_B	-	-	-	1	-
$SA[i]$	0	0	0	0	0	0	0	0	0	0	2	4	6	9	BUCKET_BSTAR	-	-	-	5
(c)													(d)						
													\$ c d (c,c) (c,d)						
i	0	1	2	3	4	5	6	7	8	9	10	11	12	BUCKET_A	0	1	7	-	-
$T[i]$	c	d	c	d	c	d	c	d	c	c	d	d	\$	BUCKET_B	-	-	-	1	-
$SA[i]$	4	0	1	2	3	0	0	0	0	0	2	4	6	9	BUCKET_BSTAR	-	-	-	0
(e)													(f)						

Figure 4: SA and the buckets after the first scan of T are shown in (a) and (b). PAb (dark gray ■ in (a), (c) and (e)) contains the text positions of all B^* -suffixes in *text order*. The buckets (b) contain the number of suffixes beginning with the corresponding characters. In (d), they are updated such the first position of each $c0$ -bucket is stored in $BUCKET_A[c0]$ (bold entries). The SA does not change during this update, see (c). In (e) we stored references to the text positions in $SA[0..m-1]$ (light gray ■) and update the corresponding $BUCKET_BSTAR$ with the first position in $SA[0..m-1]$ (bold entry in (f)).

buckets in $BUCKET_A$, $BUCKET_B$ and $BUCKET_BSTAR$ (lines 62, 69 and 65). In addition, we store the text position of each B^* -suffix at the end of SA such that $SA[n-m..n)$ contains the text positions of all B^* -suffixes (line 66). We call this part of the suffix array PAb with $PAb[i] = SA[n-m+i]$ for all $0 \leq i < m$ (line 94), see Figure 4 (a) and (b).

Next (lines 81 to 90), we compute the prefix sum of $BUCKET_A$ and $BUCKET_BSTAR$, such that $BUCKET_A[c0]$ contains the leftmost position of each $c0$ -bucket and $BUCKET_BSTAR[c0, c1]$ contains the rightmost position of the corresponding B^* -suffixes with respect only to other B^* -suffixes, i.e., the positions are in the interval $[0, m)$, see Figures 4 (c) and (d), where (c) remains unchanged. During the sorting step, we do not sort the text positions. Instead we sort *references* to these positions. These references are stored in $SA[0..m)$ (line 97). During this step, $BUCKET_BSTAR[c0, c1]$ is updated (line 97), such that it now contains the leftmost reference corresponding to a B^* -suffix in the $(c0, c1)$ -bucket within the interval $[0, m)$. The reference to the last B^* -suffix is put at the beginning of its corresponding bucket (line 100). This reference is a special case as it has no successor in PAb that is required for the comparison of two B^* -substrings, see Figure 4 (e) and (f).

3.2 Sorting the B^{*}-Suffixes

In this section, we describe how the B^{*}-suffixes are sorted in three steps. First, all B^{*}-substrings are sorted independently for each (c0, c1)-bucket (lines 134 to 142) using functions defined in `sssort.c`. Then (second step starting at line 146), a partial ISA (named ISAb) is computed, containing the ranks of the partially sorted B^{*}-suffixes (sorted by their initial B^{*}-substrings). Using these ranks we compute the lexicographical order of all B^{*}-suffixes adopting an approach similar to prefix doubling, in the last step using functions defined in `trsort.c` (line 159). We augment the approach with *repetition detection* as introduced by Maniscalco and Puglisi [13].

Sorting the B^{*}-Substrings. All B^{*}-substrings in a BUCKET_BSTAR are sorted independently and in-place. The interval of SA that has not been used yet (SA[m..n - m]) serves as a buffer during the sorting (line 133). We refer to this part of SA as `buf` with `buf[i] = SA[m + i]` for all $0 \leq i < n - 2m$. This part of DivSufSort can be executed in parallel by sorting the BUCKET_BSTAR in parallel, i.e., all B^{*}-substring in one BUCKET_BSTAR are sorted sequentially, but multiple BUCKET_BSTAR are processed in parallel (see `divsufsort.c`, lines 105 to 131). Here, each process gets a buffer of size $\frac{|\text{buf}|}{p}$, where `p` is the number of processes. All following line numbers in this subsection refer to `sssort.c`.

In the default configuration we only sort 1024 elements at once (see `SS_BLOCK_SIZE`, e.g., line 763). If the size of `buf` is smaller than 1024 or the size of the current bucket, the bucket is divided in smaller subbuckets which are then sorted and merged (see line 767, splitting due to the buffer size and the loop at line 770 splitting with respect to the number of elements). Lines 789 to 802 are used to merge the last considered subbuckets. If the currently sorted bucket contains the last B^{*}-substring it is moved to the corresponding position (lines 811 and 813).

The heavy lifting is done by the function `ss_mintrosort` that is an implementation of *Introspective Sort* (ISS) [16]. It sorts all B^{*}-substring within the interval [`first`, `last`] (line 310). ISS uses *Multikey Quicksort* (MKQS) [1] and *Heapsort* (HS). MKQS is used $\lfloor \lg(\text{last} - \text{first}) \rfloor$ times to sort an interval before HS is used (if there are still elements in the interval that have been equal to the pivot each time, see line 333). MKQS divides each interval into three subintervals with respect to a pivot element. The first subinterval contains all substrings whose k -th character is smaller than the pivot, the second subinterval contains all substrings whose k -th character is equal to the pivot, and the last subinterval contains all substrings whose k -th character is greater than the pivot. We call k the **depth** of the current iteration (line 332). ISS is not implemented recursively; instead, a stack is used to keep track of the unsorted subintervals and the smaller subintervals are always processed first. This guarantees a maximum stack size of $\lg \ell$, where ℓ is the initial interval size [15, p. 67]. The subintervals containing the substrings whose k -th character is not equal to the pivot are sorted using MKQS $\lfloor \lg(\text{last} - \text{first}) \rfloor$ times before using HS, where now `last` and `first` refer to the first and last positions of these intervals (lines 414 and 428).

Whenever an unsorted (sub)bucket is smaller than a threshold (8 in the default configuration), *Insertionsort* (IS) is used to sort the bucket and mark it sorted (line 326). Whenever we compare two B^{*}-Substrings during IS, we use the function `ss_compare` that compares two B^{*}-substrings starting at the current **depth** and compares the substrings character by character.

\$				c											
<i>i</i>	0	1	2	3	4	5	6	7	8	9	10	11	12		
T[<i>i</i>]	c	d	c	d	c	d	c	d	c	c	d	d	\$		
SA[<i>i</i>]	3	0	1̃	2̃	4	0	0	0	0	2	4	6	9		

(a)

Ref.	Text Pos.	B*-substring
3	6	cdcc
0	0	cdcd
1	2	cdcd
2	4	cdcd
4	9	cdd\$

(b)

Figure 5: The lexicographically sorted references of the B*-substrings in SA[0..m - 1] (light gray in (a)). For readability we write \tilde{i} if i is bitwise negated ($\tilde{i} < 0$ for all $0 \leq i \leq n$). The content of the buckets is not changed in this step. The references, their corresponding text positions and the B*-substrings are shown in (b).

Throughout the sorting of the B*-substrings, substrings that cannot be fully sorted, i.e. B*-substrings that are equal, are marked by storing their bitwise negated reference (line 178). Only the first reference of such an interval is stored normally to identify the beginning of an interval of unsorted substrings (line 178). There are B*-suffixes that are not sorted completely by their initial B*-substrings e.g., in our example T = cdcdcdcdcd\$ the B*-substring cdcd occurs three times – see Figure 5. Therefore, we cannot determine the order of the corresponding B*-suffixes just using their initial B*-substring. The idea of sorting the suffixes in a (c0, c1)-bucket up to a certain depth is similar to the approach of Manzini and Ferragina [14], who sort the suffixes up to a certain LCP-value.

Computing the Partial Inverse Suffix Array. After the B*-substrings are sorted, we compute the ISA for the partially sorted B*-substrings (lines 146 to 156). The inverse suffix array for the B*-suffixes is stored in SA[m..2m) and referred to as ISAb with ISAb[i] = SA[m + i]. ISAb[i] contains the rank of the i -th B*-suffix, i.e., the number of lexicographically smaller B*-suffixes. All references to line numbers in this subsection refer to divsufsort.c. We scan the SA[0..m) from right to left (line 146) and distinguish between bitwise negated references (values < 0, starting at line 154) and non-negated references (values ≥ 0 , starting at line 147). In the first case, we have reached an interval where we have references of suffixes which could not be sorted comparing only the B*-substring. We assign each of those suffixes the greatest feasible rank, i.e., $m - i$, where i is the number of lexicographically greater suffixes (similar to Larsson and Sadakane [11]). In addition we also store the bitwise negation of the references, i.e., the original reference. In the other case (a value ≥ 0) we simply assign the correct rank to the B*-suffix. Whenever we scan an interval of completely sorted B*-suffixes, we mark the first position of the interval in SA[0..m) with $-k$, where k is the size of the interval (line 150). Now we can identify all sorted intervals as they start with a negative value whose absolute value is the length of the interval.

In our example (see Figure 6) we have two fully sorted intervals of length 1 at SA[0] and SA[4], and an only partially sorted interval in SA[1..3].

i	0	1	2	3	4	5	6	7	8	9	10	11	12
$T[i]$	c	d	c	d	c	d	c	d	c	c	d	d	\$
$SA[i]$	-1	0	1	2	-1	3	3	3	0	4	4	6	9

Figure 6: **ISAb** contains the inverse suffix array of the sorted B^* -substrings. $ISAb[i] = SA[m + i]$ for all $0 \leq i < m$ (dark gray \blacksquare in **SA**). If $m > \frac{n}{3}$, **ISAb** overlaps with **PAb**. This does not matter, as we do not require the text positions at this point any more. While computing **ISAb**, we also mark completely sorted intervals in $SA[0..m - 1]$. The leftmost position of a sorted interval of length ℓ is changed to $-\ell$ (see $SA[0]$ and $SA[4]$ where we store -1 as the sorted intervals contain one entry).

Sorting the B^* -Suffixes. In the last part of the B^* -suffix sorting in DivSufSort we compute the correct ranks of all B^* -suffixes and store them in **ISAb**. During this step, we only require information about the ranks of the suffixes and have no random access to the text, i.e., **PAb** is not required any more. All line numbers in this section refer to `trsort.c`. Using **ISAb**, we compute the ranks of all B^* -suffixes using an approach similar to prefix doubling [11]. Instead of doubling the length of the suffixes we double the number of considered B^* -substrings that can have an arbitrary length (line 563). Here, $ISAd[i]$ refers to the rank of the $i + 2^k$ -th B^* -suffix, where k is the current iteration of the doubling algorithm. Obviously, we need to update the ranks when we double the number of considered substrings, i.e., compute the new ranks for the B^* -suffixes. Since the ranks in the **ISA** are given in text order, we can access the rank of the next (in text order) B^* -substring for any given substring.

Repetition Detection. The sorting that uses the new ranks as keys is done using Quicksort (QS), which also allows us to use the *repetition* detection introduced by Maniscalco and Puglisi [13] (see line 452 for the identification and the function `tr_copy` for the computation of the correct ranks). A repetition in **T** is a substring $T[i, i + rp]$ with $r \geq 2, p \geq 0$ and $i, i + rp \in [0, n)$ such that $T[i, i + p) = T[i + p, i + 2p) = \dots = T[i + (r - 1)p, i + rp)$. Those repetitions are a problem if S_i is a B^* -suffix, since then S_{kp} is a B^* -suffix for all $k \leq r$. We can simply sort all those suffixes by looking at the first character not belonging to the repetition ($T[i + rp + l] \neq T[i + l]$). If $T[i + rp + l] < T[i + l]$ then $T[i + (r - 1)p + 1, i + rp] < T[(i - 1) + (r - 1)p + 1, (i - 1) + rp]$ for all $1 < i \leq r$. The analogous case is true for $T[i + rp + l] > T[i + l]$, i.e., $T[i + (r - 1)p + 1, i + rp] > T[(i - 1) + (r - 1)p + 1, (i - 1) + rp]$ for all $1 < i \leq r$. This is done in lines 276 (and 282), where we increase (and decrease) the ranks of all suffixes in the repetition. The identification of a repetition is supported by QS. QS divides each interval into three subintervals (like MKQS). We chose the median rank of the B^* -suffixes that are considered during this doubling step as the pivot element for QS (line 455). If the (current) rank of the first B^* -suffix in the subinterval (considered in this doubling step) is equal to the pivot element, i.e., $ISAb[i] = ISAd[i]$ where i is the first B^* -suffix in the interval, then we have found a repetition (line 452, where `tr_ilg` denotes the logarithm, i.e., the number of iterations until HS is used instead of QS).

Now we have computed the **ISA** of all B^* -suffixes (stored in **ISAb**), i.e., we have all B^* -suffixes in lexicographic order. From this point on, all line numbers refer to `divsufsort.c`, again. Next (see loop starting at line 162), we scan **T** from right to left,

	i	0	1	2	3	4	5	6	7	8	9	10	11	12		0	1	2	3	4	5	6	7	8	9	10	11	12		
$T[i]$	c	d	c	d	c	d	c	d	c	d	c	d	d	d	\$	c	d	c	d	c	d	c	d	c	c	d	d	d	\$	
$SA[i]$	-1	-4	1	0	-1	3	2	1	0	4	4	6	9			$\tilde{6}$	$\tilde{4}$	$\tilde{2}$	0	9	3	2	1	0	4	4	6	9		
			</																											

		Scanned Interval																	
i	0	1	2	3	4	5	6	7	8	9	10	11	12	BUCKET_A[$\$$]	BUCKET_A[c]	BUCKET_A[d]	BUCKET_B[c, c]	BUCKET_BSTAR[c, d]	
SA[i]	$\tilde{6}$	$\tilde{4}$	$\tilde{6}$	$\tilde{4}$	$\tilde{2}$	0	9	1	0	4	4	6	9	0	1	7	1	1	First Induction Phase
SA[i]	$\tilde{6}$	$\tilde{4}$	$\tilde{6}$	$\tilde{4}$	$\tilde{2}$	0	9	1	0	4	4	6	9	0	1	7	1	1	
SA[i]	$\tilde{6}$	$\tilde{8}$	$\tilde{6}$	$\tilde{4}$	$\tilde{2}$	0	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	$\tilde{6}$	$\tilde{8}$	$\tilde{6}$	$\tilde{4}$	$\tilde{2}$	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	$\tilde{6}$	$\tilde{8}$	$\tilde{6}$	$\tilde{4}$	2	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	$\tilde{6}$	$\tilde{8}$	$\tilde{6}$	4	2	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	$\tilde{6}$	$\tilde{8}$	6	4	2	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	$\tilde{6}$	8	6	4	2	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	0	1	7	0	1	
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	1	0	4	4	6	9	1	1	7	0	1	Second Induction Phase
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	11	0	4	4	6	9	1	1	8	0	1	
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	11	7	4	4	6	9	1	1	9	0	1	
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	11	7	5	4	6	9	1	1	10	0	1	
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	11	7	5	3	6	9	1	1	11	0	1	
SA[i]	12	8	6	4	2	$\tilde{0}$	$\tilde{9}$	11	7	5	3	1	9	1	1	12	0	1	
SA[i]	12	8	6	4	2	0	$\tilde{9}$	11	7	5	3	1	9	1	1	12	0	1	
SA[i]	12	8	6	4	2	0	9	11	7	5	3	1	9	1	1	13	0	1	

Figure 8: During the first phase, we induce B-suffixes and only scan intervals where B- and B*-suffixes occur. Each of those intervals ends left of the succeeding c0-bucket. Its borders are stored in the corresponding BUCKET_BSTAR (boxed entries, the right border is not part of the interval). After the first phase we put the last suffix at the beginning of its corresponding bucket. During the second phase we scan the whole array, as we also store the bitwise negation of all entries that have already been used for inducing. The currently considered entry is marked light gray (■). The entries highlighted dark gray (■) are the positions where a value is induced. The bucket that contains the position is highlighted in the same color. Entries that have changed are bold in the following row.

induced and the corresponding suffix has type A, it is considered during the next scan (line 226) and it is ignored otherwise. After the first traversal, all suffixes that have been used for inducing are represented by their bitwise negated position whereas all other suffixes are represented by their position, i.e., a positive integer. It should be noted that all induced suffixes are lexicographically smaller than the suffix they are induced from: if we induce from a $(c0, c1)$ -bucket, we know that $c0 \leq c1$, since we are considering B-suffixes. In addition, we can only induce in $(c0, c1)$ -buckets with $c1 \leq c0$, as only B-suffixes are considered during this traversal.

Before SA is scanned a second time, $n-1$ is stored at the beginning of the $T[n-1]$ -bucket (line 234). If S_{n-2} has type A, we store $n-1$ (we want to induce S_{n-2} during the second scan). Otherwise, we store the bitwise negation of $n-1$.

During the second scan of SA (see loop starting at line 236), whenever an entry i of SA is smaller than 0 it is overwritten by its bitwise negated value, i.e., the position of the suffix in the correct position in the suffix array (line 249). Whenever $i > 0$ (line 237) the suffix S_{i-1} is induced at the leftmost free position in the $T[i-1]$ -bucket (line 243). Since all remaining suffixes are induced during this scan it is sufficient to identify the border using the $c0$ -buckets, i.e., the value stored in `BUCKET_A[c0]`. If the induced suffix would induce a B-suffix, its bitwise negated value is induced instead (line 240). At the end of the traversal SA contains the indices of all suffixes in lexicographic order.

i	0	1	2	3	4	5	6	7	8	9	10	11	12
$T[i]$	c	d	c	d	c	d	c	d	c	c	d	d	\$
SA[i]	12	8	6	4	2	0	9	11	7	5	3	1	10

Figure 9: The final SA of $T = \text{cdcdcdcdccdd}\$$.

4 Inducing the LCP-Array

We now show how to modify DivSufSort such that it also computes the LCP-array in addition to SA. To do so, we extend DivSufSort at three points of the computation of SA. First, we need to compute the LCP-values of all B^* -suffixes. Next, during the inducing step, we also induce the LCP-values for A- and B-suffixes. For this we utilize a technique also described in [2, 4] that allows us to answer RMQs on LCP using only a stack [6]. Last, we compute the LCP-values of suffixes at the border of buckets, as those values cannot be induced.

Recall that the LCP-value of two arbitrary suffixes S_i and S_j is denoted by $\text{lcp}(i, j)$. We need the following additional definition: Given an array A of length ℓ and $0 \leq i \leq j \leq \ell$, a *range minimum query* $\text{RMQ}_A[i, j]$ asks for the minimum in A in the interval $[i, j]$, in symbols: $\text{RMQ}_A[i, j] = \min \{A[k] : i \leq k \leq j\}$.

4.1 Computing the LCP-Values of the B^* -Suffixes

During the sorting of the B^* -suffixes (right before the B^* -suffixes are put at their correct position in $\text{SA}[0..n)$), all lexicographically sorted B^* -suffixes are in $\text{SA}[0..m)$. There are two cases regarding m (the number of B^* -suffixes). If $m > \frac{n}{3}$, we have overwritten the text positions of the B^* -suffixes in `PAb` with `ISAb`. In this case we must compute the LCP-values naively.⁴ Otherwise (we still know the text positions

⁴ For all tested instances (see Section 5) $m \leq \frac{n}{3}$.

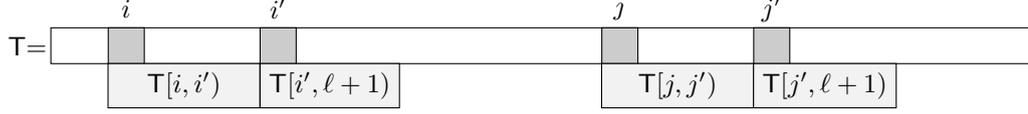


Figure 10: Let $S_i, S_j, S_{i'}$ and $S_{j'}$ be B^* -suffixes such that there is no B^* -suffix S_k with $i < k < i'$ or $j < k < j'$, and let the LCP-value of S_i and S_j be $\ell = \text{lcp}(i, j) + i$. Then the LCP-value of $S_{i'}$ and $S_{j'}$ is $\text{lcp}(i', j') = \ell - i' = \text{lcp}(i, j) - (i' - i)$.

of all B^* -suffixes), we compute their LCP-values using a sparse version of the Φ -algorithm [8], based on Observation 2, which was also used implicitly in [2, 4].

Observation 2 *If $S_i, S_{i'}, S_j$ and $S_{j'}$ are B^* -suffixes such that $i < i', j < j'$ and there is no other B^* -suffix S_k such that $i < k < i'$ or $j < k < j'$, then $\text{lcp}(i', j') \geq \text{lcp}(i, j) - (i' - i)$.*

This is possible as we know the distance (in the text) of two B^* -suffixes, i.e., $\text{PAb}[i] - \text{PAb}[j]$ is the distance of the i -th and j -th B^* -suffix with $1 \leq i \leq j \leq m$. See Figure 10 for an Example. Algorithm 1 shows the *sparse* version of the Φ -algorithm. The difference to the original algorithm [8] is that the next considered suffix is an arbitrary number of character shorter than the previous one, which results in Observation 2. The computation of the LCP-values does not require any additional memory except for the n words for LCP, where we temporarily store additional data.

First (lines 1 to 4 of Algorithm 1), we fill the PHI (stored in $\text{LCP}[m..2m]$) such that $\text{PHI}[i]$ contains the text position of the suffix that is lexicographically consecutive to the i -th suffix (text position). In $\text{DELTA}[i]$ (stored in $\text{LCP}[n - m..n]$) we store the text distance of the i -th and $(i + 1)$ -th B^* -suffix (text occurrence), i.e., $\text{PAb}[i + 1] - \text{PAb}[i]$. Then (lines 5 to 8), we compute the sparse LCP-array using Observation 2. As we store the LCP-values in PHI in text order, we need to rewrite them to LCP (line 9).

4.2 Inducing the LCP-Values in Addition to the SA

During the inducing of the B-suffixes, whenever a suffix is induced at position u in SA and there is already a suffix at position $u + 1$ in the same (c0, c1)-bucket, there are two cases:

Algorithm 1: Sparse Φ -Algorithm

Input : $T, m, SA, \text{ISAb} = \text{SA}[m..2m - 1], \text{PAb} = \text{SA}[n - m..n - 1]$ and LCP,
 $\text{PHI} = \text{LCP}[m..2m - 1]$ $\text{PHI} = \text{DELTA}[n - m..n - 1]$.

Output : $\text{LCP}[0..m - 1]$ contains the LCP-values of the B^* -suffixes.

```

1 PHI[SA[0]] = -1
2 for i = 1; i ≤ m - 1; i = i + 1 do
3   | PHI[SA[i]] = SA[i - 1]
4   | DELTA[i - 1] = PAb[i] - PAb[i + 1]
5 for i = 0, p = 0; i < m; i = i + 1 do
6   | while T[PAb[i] + p + 1] = T[PAb[PHI[i]] + p + 1] do
7     |   p = p + 1
8     | PHI[i] = p and p = max {0, p - DELTA[i]}
9 for i = 0; i < m; i = j + 1 do LCP[ISAb[i]] = PHI[i];
```

4.3 Special Cases during LCP Induction

There are three special cases where the LCP-value cannot be induced using the min-stack (or RMQs in general). The first case occurs if a suffix is induced next to a B^* -suffix. The inducing can happen to the left or right of the already placed B^* -suffix. The former case is easy as there cannot be an A- or B-suffix to the left of a B^* -suffix in the same $(c0, c1)$ -bucket. Therefore, we only need to check whether the suffixes are in the same $c0$ -bucket to compute the LCP-value for the B^* -suffix, which is either 0 or 1. The other case (a suffix is induced to the right of a B^* -suffix) is more demanding, as the LCP-value must be computed. Fortunately, this can be done more sophisticated than by naive comparison of the suffixes. First, we check whether both the B^* -suffix S_i and the B-suffix S_j are in the same $(c0, c1)$ -bucket. If not, the LCP-value is 1 if they occur in the same $c0$ -bucket, and 0 otherwise. However, if they occur in the same $(c0, c1)$ -bucket, we know that S_i has a prefix $c0c1d$, $d \in \Sigma$, such that $c0 < c1 \geq d$, and that S_j has a prefix $c0c1e$, $e \in \Sigma$, such that $c0 < c1 \leq e$. Hence, the LCP-value is $\max\{k \geq 0: T[i+1, i+k+2] = T[j+1, j+k+2]\} + 1$, i.e., the first appearance of a character not equal to $c1$ in either suffix. In the last case (an A-suffix is induced next to a B-suffix) the LCP-value can be determined in an analogous way.

5 Experiments with LCP-Construction

We implemented the modified DivSufSort in C and compiled it using gcc version 6.2 with the compiler options `-DNDEBUG`, `-O3` and `-march=native`. Our implementation is available from <https://github.com/kurpicz/libdivsufsort>. We ran all experiments on a computer equipped with an Intel Core i5-4670 processor and 16 GiB RAM, using only a single core.

We evaluated our algorithm on the *Pizza & Chili* Corpus⁵ and compared our implementation to the following LCP-construction algorithms (using the same compiler options): *KLAAP* [9] is the first linear-time LCP-construction algorithm. The Φ -algorithm [8] is an alternative to KLAAP that reduces cache-misses. *Inducing+SAIS* [4] is an LCP-construction algorithm (using similar ideas as in this paper) based on SAIS [17], and *naive* scans the suffix array and checks two consecutive suffixes character by character.

We also looked at LCP-construction algorithms requiring the *Burrows-Wheeler transform*, i.e., *GO* and *GO2* by Gog and Ohlebusch [6]. Since these algorithms are only available in the *succinct data structure library* (SDSL) [5], which has an emphasis on a low memory footprint, the running times are affected by that.

The results of our experiments can be found in Table 1. As a brief summary, our practical tests show that Φ (see column 1) is the fastest LCP-construction algorithm if SA is already given, while our new implementation (column 6) is faster than the only other inducing-based approach (last 2 columns).

6 Conclusions

We presented a detailed description of *DivSufSort* that has not been available albeit its wide use in different applications. We linked interesting approaches, e.g., the rep-

⁵ <http://pizzachili.dcc.uchile.cl/>, last seen 05.07.2017

		LCP given SA (and BWT if necessary)						SA		SA + LCP		
Text	Φ [8]	KLAAP [9]	naive	GO [6]	GO2 [6]	inducing [this paper]	inducing [4]	DivSufSort	SAIS [17]	inducing + DivSufSort [this paper]	inducing + SAIS [4]	
20 MB	dna	0.77	0.91	1.180	6.46	2.65	0.78	1.12	1.45	1.71	2.23	2.83
	english	0.61	0.77	44.72	7.90	4.03	0.64	0.91	1.45	1.65	2.09	2.56
	dblp.xml	0.54	0.55	1.640	2.56	3.92	0.53	0.82	1.06	1.29	1.59	2.11
	sources	0.54	0.57	1.530	2.87	4.26	0.57	0.85	1.07	1.41	1.64	2.26
	proteins	0.60	0.67	4.190	5.46	3.24	0.66	0.96	1.51	1.79	2.17	2.75
50 MB	dna	2.02	2.360	3.240	16.25	14.43	2.06	2.96	3.88	4.57	5.94	7.53
	english	1.70	2.080	65.85	15.41	12.76	1.88	2.65	3.83	4.56	5.71	7.21
	dblp.xml	1.41	1.45	4.370	9.490	9.370	1.39	2.17	2.93	3.53	4.32	5.70
	sources	1.45	1.49	6.950	10.06	10.15	1.51	2.26	2.87	3.77	4.38	6.03
	proteins	1.77	2.01	6.560	14.38	15.74	1.87	2.83	4.55	5.27	6.42	8.10
100 MB	dna	4.11	4.75	6.590	26.03	26.62	4.24	5.95	8.23	9.44	12.47	15.39
	english	3.56	4.28	185.9	32.57	28.09	4.02	5.62	7.96	9.49	11.98	15.11
	dblp.xml	2.85	2.89	9.040	19.91	21.49	2.82	4.41	6.19	7.22	9.010	11.63
	sources	2.93	3.02	39.85	24.92	24.46	3.07	4.62	5.98	7.72	9.050	12.34
	proteins	3.56	4.09	16.99	30.89	28.12	3.96	5.86	9.91	10.96	13.87	16.82
200 MB	dna	8.25	10.0	17.36	76.11	79.02	8.64	12.02	17.41	19.18	26.05	31.20
	english	7.23	8.70	1070	72.58	73.75	8.25	11.49	16.80	19.39	25.05	30.88
	dblp.xml	5.75	6.28	18.23	49.97	52.91	5.77	9.120	12.99	14.72	18.76	23.84
	sources	5.98	6.23	52.60	61.61	59.01	6.37	9.700	12.63	16.01	19.00	25.71
	proteins	6.86	7.94	42.60	78.78	77.40	8.33	11.82	19.73	21.65	28.06	33.47

Table 1: The first seven columns contain the times solely for the computation of LCP. Since the inducing algorithms are interleaved with the computation of SA, we subtracted the time to compute SA with the corresponding inducing approach (“inducing [this paper]” and “inducing [4]”). *GO* and *GO2* require the BWT in addition to SA; the time to compute BWT is also not included. The last two columns show the time to compute SA and LCP using the inducing approach. All times are in seconds, and are the average over 21 runs on the same input.

etition detection, to the corresponding lines in the source code and to the original literature.

Compared with SAIS, the other popular suffix array construction algorithm based on inducing, DivSufSort is faster. We ascribe this to the two main differences between DivSufSort and SAIS: First, the sorting of the initial suffixes in SAIS (the ones that cannot be induced) is done by recursively applying the algorithm (and renaming the initial suffixes), which is slower in practice than the string-sorting and prefix doubling-like approach used by DivSufSort (which also employs techniques like repetition detection to further decrease runtime). Second, the classification of the initial suffixes differs: while the suffixes that have to be sorted initially in SAIS can be displaced during the inducing of the SA, they are not moved again in DivSufSort. This also allows DivSufSort to skip parts (containing only A-suffixes) of the SA during the first induction phase.

In addition, we showed that the LCP-array can be computed during the inducing of the suffix array in DivSufSort. This approach is faster than the previous known

inducing LCP-construction algorithm based on SAIS [4], and competitive with the Φ -algorithm, i.e, the fastest pure LCP-construction algorithms.

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