# Li, Li, Huo - Optimal In-Place Suffix Sorting

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DSSC - Algorithmic Design Exam

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## **Problem Setting**

Suffix Arrays: a space-saving alternative to suffix trees.

#### **Definition**

Given a string  $T=T[0,\ldots,n-1]$  where each  $T[i]\in\Sigma$  integer alphabet, the *suffix array SA* contains the indices of all suffixes of T which are sorted in lexicographical order.

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## **Example**

T = "1120", the suffixes are  $\{1120, 220, 20, 0\}$ . Since suf(3) < suf(0) < suf(2) < suf(1), then SA = [3021].

## **Problem Setting**

#### **Problem**

Construct SA for a given string T.

#### Main Theorem

There is an in-place linear time algorithm for suffix sorting over integer alphabets, even if the input string T is read only and the size of the alphabet  $|\Sigma|$  is O(n).

#### **Naive Solution**

- Get all the suffixes and sort them using *Quicksort*, while retaining their original indices.  $O(n \log n)$  comparisons for sorting, O(n) to compare suffixes: worst case is  $O(n^2 \log n)$ .
- Build a suffix tree in O(n) and perform a depth-first traversal on it in O(n).

# **Preliminary Notions**

#### **Notations:**

- suf(i) is said to be S-suffix if suf(i) < suf(i+1). Otherwise,</li>
   it is L-suffix;
- suf(i) is said to be LMS-suffix if suf(i) is S-suffix and suf(i-1) is L-suffix;

#### Note

Types (S or L, and LMS) can be computed by a linear scan of T.

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Types (S or L, and LMS) can be computed by a linear scan of T.

**Example:** T = "3122120"

Index	0	1	2	3	4	5	6	7
Т	3	1	2	2	1	1	2	0
Type	L	S	L	L	S	S	L	S
LMS		*			*			*

# **Suffix Sorting for Read-only Integer Alphabets**

#### **Definitions and assumptions:**

- $n_S(n_L)$  denotes the number of S-suffixes (L-suffixes);
- $n_L \leq n_S$ ;
- n<sub>1</sub> denotes the number of LMS-suffixes;
- SA[0, ..., n-1] will store the result;
- Bucket: set of suffixes with the same first character.

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- SA[0, ..., n-1] will store the result;
- Bucket: set of suffixes with the same first character.

## Algorithm:

- 1. Sort all LMS-characters of T;
- 2. Induced sort all *LMS*-substrings from sorted *LMS*-characters;
- Construct the reduced problem T<sub>1</sub> from sorted LMS-substrings;
- 4. Sort the *LMS*-suffixes by recursively solving  $T_1$ ;
- 5. Induced sort all suffixes of T from the sorted LMS-suffixes.

#### 1. Sort all LMS-characters of T

The *LMS*-characters can be sorted with *Counting Sort*, using  $SA[0,\ldots,n/2]$  as the counting array and storing the result in  $SA[n-n_1,\ldots,n-1]$ .

Index	0	1	2	3	4	5	6	7
Т	3	1	2	2	1	1	2	0
Type	L	S	L	L	S	S	L	S
LMS		*			*			*



The sorting step takes O(n) time and uses O(1) workspace.

# 2. Induced sort all *LMS*-substrings from sorted *LMS*-characters

This step is analogous to step 5.

After this step, indices of the ordered *LMS*-substrings are stored in  $SA[n-n_1,\ldots,n-1]$ .

Index	0	1	2	3	4	5	6	7						
Т	3	1	2	2	1	1	2	0	SA				7	1
Type	L	S	L	L	S	S	L	S	SA		\ 	/	7	4
LMS		*			*			*	5/ (				,	•

*LMS*-substrings are {1121, 1120, 0}.

# 3. Construct the reduced problem $T_1$

Using the lexicographical order of the *LMS*-substrings, build the reduced problem  $T_1$  and store it in  $T[0, \ldots, n_1]$ .  $T_1$  can be obtained by a liner scan of SA, thus using O(n) time and O(1) workspace.

Index	0	1	2	3	4	5	6	7									
Т	3	1	2	2	1	1	2	0	SA						7	4	1
Type	L	S	L	L	S	S	L	S	SA	2	1	0	<u> </u>	<b>/</b>	7	4	1
LMS		*			*			*	5/1		•	L		<u> </u>	,	•	•

*LMS*-substrings are {1121, 1120, 0}.

# 4. Sort the LMS-suffixes by recursively solving $T_1$

 $T_1$  can be solved iteratively in linear time<sup>1</sup> with no additional workspace. It is stored at the beginning of SA. The LMS-suffixes are sorted using linear scans and the solution of  $T_1$ .

									SA	2	1	0					
Index	0	1	2	3	4	5	6	7					١	1			
Т	3	1	2	2	1	1	2	0	SA	2	1	0			1	4	7
Type	L	S	L	L	S	S	L	S	SA	7	4	1	\ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \	,	1	4	7
LMS		*			*			*		-			١	r			
									SA						7	4	1

LMS-suffixes are  $\{1221120, 1120, 0\}$ .

The complexity of this step is O(n) in time and O(1) in workspace.

$$^{1}\mathcal{T}(n) = \mathcal{T}(n/2) + n = n(1 + 1/2 + 1/4 + 1/8 + \dots + 1/\log_{2} n) \in \Theta(n)$$

It can be demonstrated that sorting the  $n_L$  *L*-suffixes from the sorted *LMS*-suffixes is symmetrical as sorting the  $n_S$  *S*-suffixes from the sorted *L*-suffixes. Suppose *L*-suffixes are sorted.

Index	0	1	2	3	4	5	6	7									
Т	3	1	2	2	1	1	2	0	SA						7	4	1
_	_				_								١	1			
Type	L	S	L	L	S	S	L	S	SA	6	3	2	0				
LMS		*			*			*									

L-suffixes are {31221120, 221120, 21120, 20}.

The ordering of the *S*-suffixes proceeds in two steps:

- 1. Construct a pointer data structure  $\mathcal{P}$  and, combining it with the interior counter trick induce the first  $n_S c_P$  S-suffixes;
- 2. Use *Binary Search* and the *Interior Counter Trick* on the last  $c_P$  *S*-suffixes.

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#### Pointer Data Structure

Built in linear time, indicates the bucket tails of a S-suffix in constant time. Occupies at most  $c_P = cn/\log n$  words, placed at the end of SA.

#### Interior Counter Trick

Dynamically maintain the *RF*-pointers (rightmost free pointers) for each bucket. AUX

# 5. Induced Sort Algorithm

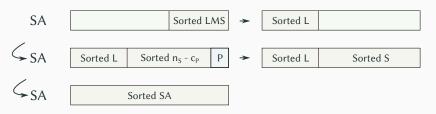
Suppose *L*-indices are already sorted in their buckets.

```
def InducedSort(T, SA):
    for i = n - 1 downto 0:
        j = SA[i] - 1 # Indicizes the bucket.
        if T[j] is S-type:
          *RF[j] = j
          RF[j] = next_free_entry
        endif
    endfor
enddef
```

For each query of RF, the tail of the bucket is provided in constant time by the pointer data structure, from that the interior counter trick indicates the RF entry.

The first  $n_S - c_P$  *S*-suffixes can be ordered in linear time with no additional workspace. The remaining suffixes can be sorted analogously, using binary search to find the tails of the buckets, since  $c_P \log n = O(n)$  and time linearity is preserved.

A stable, in place linear time merging can be used to merge the sorted S- and L-suffixes.



#### Additional results and conclusion

## (Read-only) Integer Alphabets

Considering all the steps, it follows that the algorithm takes O(n) time and O(1) workspace to compute the suffix array of a string T over integer alphabets  $\Sigma$ , where T is read-only and  $|\Sigma| = O(n)$ .

The result trivially holds for non-read-only integer alphabets.

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## Read Only General Alphabets

For read-only general alphabets (i.e., only comparisons allowed on T) there is an in-place  $O(n \log n)$  time algorithm for suffix sorting.

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#### References

Li, Zhize, Jian Li, and Hongwei Huo. "Optimal in-place suffix sorting." *International Symposium on String Processing and Information Retrieval.* Springer, Cham, 2018.

**Auxiliary Material** 

## **AUX: Sort** all *LMS*-characters of *T*

Since  $|\Sigma| = O(n)$ , assume  $\exists d \in \mathbb{N}$  s.t.  $|\Sigma| \leq dn$ . Divide LMS-characters in 2d partitions, where partition i contains elements in  $\left\lceil \frac{i|\Sigma|}{2d} + 1, \frac{(i+1)|\Sigma|}{2d} \right\rceil$ . Since

$$\frac{|\Sigma|}{2d} \le \frac{dn}{2d} = \frac{n}{2},$$

 $SA[0,\ldots,n/2]$  can be used as a counting array.



#### AUX: Interior counter trick - 1

Consider a bucket of size m, indexing it as  $SA_S\{0, ..., m-1\}$ . Define the special symbols  $B_H$ ,  $B_T$ , E,  $R_1$  and  $R_2$ . Index(i) denotes the index of the i-th S-suffix of the bucket. The position of the tail, i.e., m-1, is given by the pointer data structure.

```
def InteriorCounterTrick(SAs):
  SAs[0] = BH, SAs[m-2] = E, SAs[m-1] = BT
  # O(m) time.
  if SAs[m-1]=BT and
    (SAs[m-2]=E \text{ or } SAs[m-SAs[m-2]-3!=BH):
    for i=1 upto m-3:
      SAs[m-3+1] = Index(i)
      SAs[m-2]++ # Acts as a counter.
    endfor
  endif
```

## AUX: Interior counter trick - 2

```
# O(m) time.
if SAs[m-1]=BT and SAs[m-SAs[m-2]-3=BH:
  shift SAs[1,...,m-3] to SAs[2,...m-2]
  SAs[1] = Index(m-2)
  SAs[m-1]=R2
endif
# O(m) time.
if SAs[m-1]=R2;
  shift SAs[1,...,m-2] to SAs[2,...,m-1]
  SAs[1] = Index(m-1)
  SAs[0]=R1
endif
```

#### AUX: Interior counter trick - 3

```
# O(m) time, need to scan from tail
# backwards to find R1.
else:
    SAs[0]=Index(m)
enddef
```

The function consists of four steps, each O(m) time, assuming that the tail of a bucket is known. It uses O(1) workspace and, for all the buckets, results in O(n) time.

#### AUX: Pointer data structure - 1

Assuming  $|\Sigma| \leq dn$ , divide the S-suffixes of T in 4d parts, according to their first character. Let  $D_i$  denote the pointer data structure of the i-th part.  $D_0$  can be constructed as follows (analogously for the others). For brevity,  $b = |\Sigma|/4d$ .

```
def PointerDataStructure(T, SAs):
    SAs[i]=1 forall i in [1,b]
    for i=b downto 1:
        if T[i] is S-type: SAs[T[i]]++
    endfor
```

#### AUX: Pointer data structure - 2

```
sum = -1
   for i=1 upto b:
     sum += SAs[i]
     SAs[i]=sum
   endfor
enddef
For every S-suffix for which T[i] \in SA_S[i, |\Sigma|/4d],
SA_S[T[i]] - T[i] indicates the tail of the bucket T[i]: the tail of a
bucket can be obtained in constant time.
```