

# Average Complexity for Updating a Suffix Array

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# Introduction

## Suffix Array

- ▶ Index introduced in 1990.
- ▶ Matching a pattern of length  $m$  in a text  $T$  of length  $n$  in  $O(m \log n)$  worst-case time (or  $O(m + \log n)$  with a LCP array).
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## Updating a suffix array when $T$ is altered

- ▶ Gallé, Peterlongo, Coste (2008);
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- ▶ Al-Hafeedh, Mouchard, Salson, Smyth.

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## Question

- ▶ Why is it quicker than reconstructing the suffix array? <sup>1</sup>
- ▶ Do we reorder many suffixes?

<sup>1</sup> For a little number of modifications



## Suffix Array

$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



## Suffix Array

$T =$     0 1 2 3 4 5 6 7 8 9  
          C G A G A C G A A \$

Sorted suffixes



# Suffix Array

$T =$ 

0	1	2	3	4	5	6	7	8	9
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Sorted suffixes

9 \$



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$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



Sorted suffixes

9 \$

8 A \$





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$T =$ 

0	1	2	3	4	5	6	7	8	9
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Sorted suffixes

9 \$  
 8 A \$  
 7 A A \$



## Suffix Array

$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



Sorted suffixes

9	\$
8	A \$
7	A A \$
4	A C G A A \$



# Suffix Array

$T =$   $\begin{matrix} 0 & 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 \\ C & G & A & G & A & C & G & A & A & \$ \end{matrix}$



Sorted suffixes

9    \$

8    A \$

7    A A \$

4    A C G A A \$

2    A G A C G A A \$



# Suffix Array

$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



Sorted suffixes

9	\$								
8	A	\$							
7	A	A	\$						
4	A	C	G	A	A	\$			
2	A	G	A	C	G	A	A	\$	
5	C	G	A	A	\$				



# Suffix Array

$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



Sorted suffixes

9	\$									
8	A	\$								
7	A	A	\$							
4	A	C	G	A	A	\$				
2	A	G	A	C	G	A	A	\$		
5	C	G	A	A	\$					
0	C	G	A	G	A	C	G	A	A	\$



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$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



Sorted suffixes

9	\$									
8	A	\$								
7	A	A	\$							
4	A	C	G	A	A	\$				
2	A	G	A	C	G	A	A	\$		
5	C	G	A	A	\$					
0	C	G	A	G	A	C	G	A	A	\$
6	G	A	A	\$						



# Suffix Array

$T =$ 

0	1	2	3	4	5	6	7	8	9
C	G	A	G	A	C	G	A	A	\$



Sorted suffixes

9	\$									
8	A	\$								
7	A	A	\$							
4	A	C	G	A	A	\$				
2	A	G	A	C	G	A	A	\$		
5	C	G	A	A	\$					
0	C	G	A	G	A	C	G	A	A	\$
6	G	A	A	\$						
3	G	A	C	G	A	A	\$			



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Sorted suffixes

9	\$									
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0	C	G	A	G	A	C	G	A	A	\$
6	G	A	A	\$						
3	G	A	C	G	A	A	\$			
1	G	A	G	A	C	G	A	A	\$	





# Suffix Array

$$T = \begin{array}{cccccccccc} & 0 & 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 \\ & C & G & A & G & A & C & G & A & A & \$ \end{array}$$

Sorted suffixes

9	\$									
8	A	\$								
7	A	A	\$							
4	A	C	G	A	A	\$				
2	A	G	A	C	G	A	A	\$		
5	C	G	A	A	\$					
0	C	G	A	G	A	C	G	A	A	\$
6	G	A	A	\$						
3	G	A	C	G	A	A	\$			
1	G	A	G	A	C	G	A	A	\$	

↙ LCP



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Sorted suffixes

9	\$									
8	A	\$								
7	A	A	\$							
4	A	C	G	A	A	\$				
2	A	G	A	C	G	A	A	\$		
5	C	G	A	A	\$					
0	C	G	A	G	A	C	G	A	A	\$
6	G	A	A	\$						
3	G	A	C	G	A	A	\$			
1	G	A	G	A	C	G	A	A	\$	



# Suffix Array

$T' = \overset{0}{C} \overset{1}{G} \overset{2}{A} \overset{3}{G} \overset{4}{A} \overset{5}{G} \overset{6}{C} \overset{7}{G} \overset{8}{A} \overset{9}{A} \overset{10}{\$}$

Sorted suffixes

9 \$

8 A \$

7 A A \$

4 A C G A A \$

2 A G A C G A A \$

5 C G A A \$

0 C G A G A C G A A \$

6 G A A \$

3 G A C G A A \$

1 G A G A C G A A \$

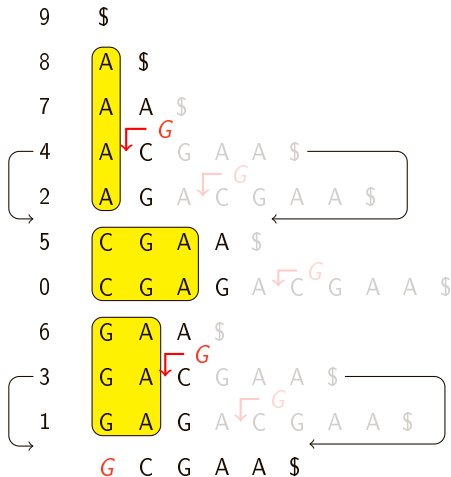
G C G A A \$



# Suffix Array

$$T' = \overset{0}{C} \overset{1}{G} \overset{2}{A} \overset{3}{G} \overset{4}{A} \overset{5}{G} \overset{6}{C} \overset{7}{G} \overset{8}{A} \overset{9}{A} \overset{10}{\$}$$

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## Number of Suffixes Moved

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How many suffixes are not well ordered, after a modification in the text?

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### A partial answer

In the worst case  $n - 1$  (e.g.  $A^n\$$ , insertion of a B:  $A^nB\$$ ).

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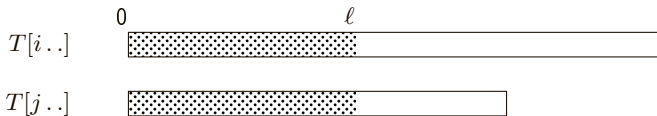
### Remark

Depending on the LCP value, only few suffixes may be moved.

## Number of Suffixes Moved

## Idea

Let us consider two consecutive suffixes in the suffix array, and  $\ell$  their LCP.





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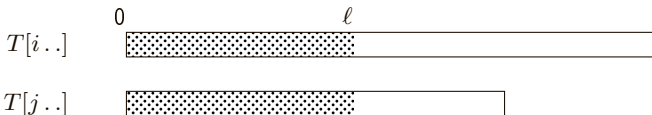


No more than  $\ell$  suffixes will be moved if the text is modified at position  $i + \ell + 1$ .

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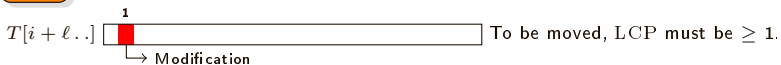
### Idea

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No more than  $\ell$  suffixes will be moved if the text is modified at position  $i + \ell + 1$ .

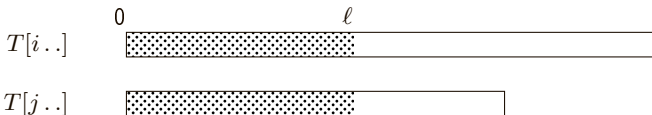
### Proof



## Number of Suffixes Moved

### Idea

Let us consider two consecutive suffixes in the suffix array, and  $\ell$  their LCP.



No more than  $\ell$  suffixes will be moved if the text is modified at position  $i + \ell + 1$ .

### Proof

$T[i + \ell ..]$   To be moved, LCP must be  $\geq 1$ .  
 ↪ Modification

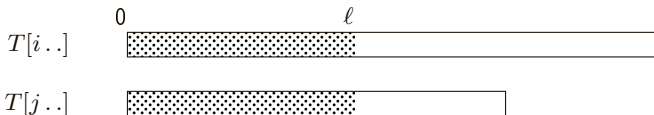
$T[i + \ell - 1 ..]$   To be moved, LCP must be  $\geq 2$ .



## Number of Suffixes Moved


### Idea

Let us consider two consecutive suffixes in the suffix array, and  $\ell$  their LCP.



No more than  $\ell$  suffixes will be moved if the text is modified at position  $i + \ell + 1$ .

### Proof

$T[i + \ell..]$   To be moved, LCP must be  $\geq 1$ .  
 ↪ Modification

$T[i + \ell - 1..]$   To be moved, LCP must be  $\geq 2$ .

$T[i..]$   To be moved, LCP must be  $\geq \ell + 1$ .

## Number of Suffixes Moved

Let  $r[i]$  be the maximal number of suffixes to be reordered when updating the text at position  $i$ .

### Property

The  $r$  array is a permutation of the LCP array.

### Corollary

The average number of suffixes moved when updating the suffix array is  $L_{ave}$ , the average LCP value of the text.



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### What do we know about $L_{ave}$ ?

- ▶ ranges from 0 to  $n/2$ , depending on texts;
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### In practice

Texts indexed are usually:

- ▶ genome sequences;
- ▶ natural language texts.



## $L_{ave}$ on genome sequences

### How repetitive are genomes?

Haubold and Wiehe (2006) classified genome sequences according to an index of repetitiveness.

Result: *Methylobacillus Flagellatus* is the most repeated one.



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### Results

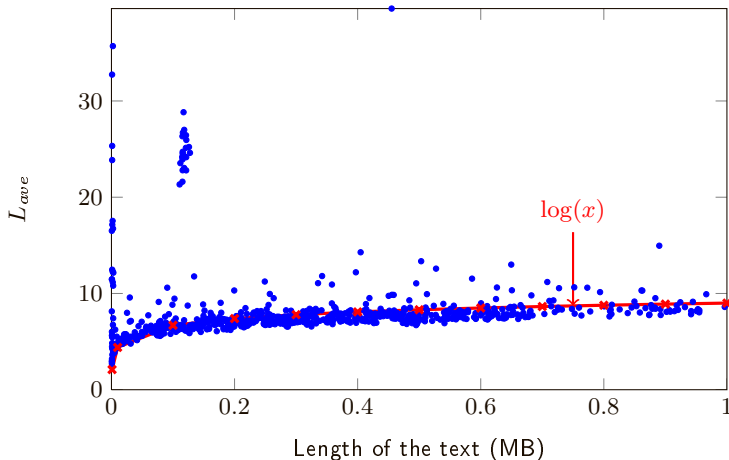
Name	Length	$L_{max}$	$L_{ave}$
Most repeated sequences			
<i>M. flagellatus</i>	2,971,519	143,034	3,452
<i>S. agalactiae</i>	2,211,485	47,068	546
Sequences of interest			
<i>D. melanogaster</i>	120,290,946	30,892	66
<i>C. elegans</i>	100,269,917	38,987	45

$L_{ave}$  for natural language texts

## Plain texts

Digitalised books and texts from Gutenberg project.

746 texts from Gutenberg project

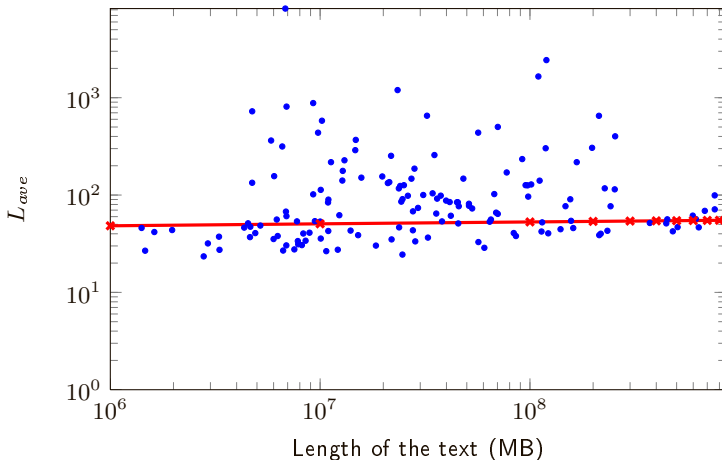


$L_{ave}$  for natural language texts

## Formatted texts

Wiki-formatted corpora from the Wikipedia encyclopedia.

151 corpora from the Wikipedia encyclopedia



## Conclusion

### Theoretically

- ▶  $L_{ave}$  suffixes are moved on average, when updating a suffix array;
- ▶  $L_{ave}$  is logarithmic for random texts.

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### Number of suffixes moved in practice

- ▶  $\simeq 1/1000$ , for pathological cases; much less in other cases;

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- ▶  $L_{ave}$  is logarithmic for random texts.

## Number of suffixes moved in practice

- ▶  $\simeq 1/1000$ , for pathological cases; much less in other cases;
- ▶ logarithmic for plain natural-language texts.