# String Synchronizing Sets

Sublinear-Time BWT Construction and Optimal LCE Data Structure

# Dominik Kempa and Tomasz Kociumaka







STOC 2019 Phoenix, AZ June 25th, 2019

### Burrows-Wheeler Transform: Definition

Burrows & Wheeler, 1994

#### T 1101001010101010010100

```
BWT
      0010100
      0010101010010100
      0100
      010010100
      010010101010010100
      010100
      01010010100
      0101010010100
      010101010010100
      100
      10010100
       10010101010010100
       10100
       .010010100
       1010010101010010100
      11010010101010010010100
```

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T 11010010101010100
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      010100
      01010010100
      0101010010100
      010101010010100
      100
      10010100
      10010101010010100
      10100
       1010010100
        10010101010010100
      11010010101010010100
```

## Burrows-Wheeler Transform: Applications

*T* : 11010010101010010100 BWT(*T*) : 0111111011000001000

- First step in compression schemes, e.g., bzip2
  - If T is compressible, then BWT(T) has long **runs** of equal symbols.
  - **Simple** methods on BWT(T) instead of **difficult** methods on T.
- Main component of indexes solving many tasks in small space:
  - MINIMALABSENTWORD
  - LongestBorder.
  - MaximalRepeats
  - MatchingStatistics
  - TANDEMREPEATS

- APPROXSHORTESTSUPERSTING
- LongestCommonSubstring
- MaximalUniqueMatches
- SHORTESTUNIQUESUBSTRING
- LongestRepeatedFactor

Selected construction algorithms:

Algorithm	Space (words)	Time
Classic (suffix trees)	$\mathcal{O}(n)$	$\mathcal{O}(n\log\sigma)$
Farach (FOCS'97)	$\mathcal{O}(n)$	$\mathcal{O}(n)$

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Why  $\mathcal{O}(n/\sqrt{\log n})$  rather than  $\mathcal{O}(n/\log n)$  time?

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BWT construction in  $o(n/\sqrt{\log n})$  time for binary length-n strings

Counting inversions in  $o(m\sqrt{\log m})$  time for length-m permutations Would improve upon the algorithm by Chan and Pătrașcu (SODA 2010).

## Longest Common Extension Queries

Landau & Vishkin, J. Comput. Syst. Sci. 1988

#### **Definition**

The **Longest Common Extension** LCE(i, j) is the length of the longest common prefix of T[i ... n] and T[j ... n].

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#### **Definition**

The **Longest Common Extension** LCE(i, j) is the length of the longest common prefix of T[i ...n] and T[j ...n].

Used as a **subroutine** in many algorithms and data structures such as for:

- approximate pattern matching (the kangaroo method),
- discovery of repetitions in strings,
- construction of text indexing data structures.

## Data Structures for LCE Queries

Data structures supporting constant-time LCE queries:

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#### Asymptotically optimal for each alphabet size!

## BWT construction algorithm

## Toy special case:

T is binary except for 2's at  $\Theta(\frac{n}{\tau})$  positions, at least one every  $\tau$  positions.

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```
Example for \tau=4:   
1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 2 1 0 1 2 0 1 2 1 0 1 2 1 0 2 0 2
```

```
20 2

5 2012101210210202

18 202

1 21012012101210210202

8 2101210210202

15 210202

12 210210202
```

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**Fact:** Suffixes starting with a 2 can be sorted in  $\mathcal{O}(n/\tau)$  time.

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1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
2	1	0	1	2	0	1	2	1	0	1	2	1	0	2	1	0	2	0	2
D				В			D				Ε			Ε			С		Α

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D				В			D				Ε			Ε			C		Α

```
7 A 20 2
2 BDEECA 5 2012101210210202
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## Toy special case:

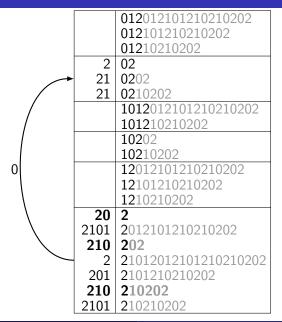
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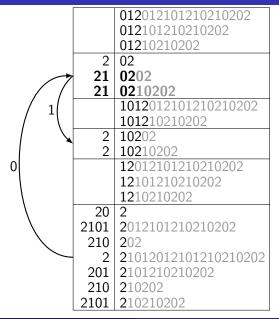
						E>	kan	np	le i	tor	au	=	4:						
1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
2	1	0	1	2	0	1	2	1	0	1	2	1	0	2	1	0	2	0	2
D				В			D				Ε			Ε			С		Α

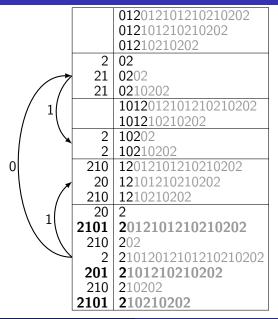
7	Α	20	2
2	BDEECA	5	2012101210210202
6	CA	18	202
1	DBDEECA	1	21012012101210210202
3	DEECA	8	2101210210202
5	ECA	15	210202
4	EECA	12	210210202

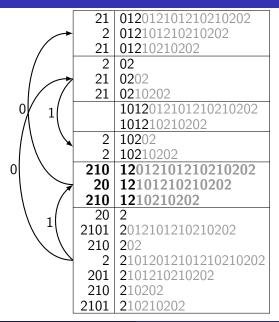
<b>012</b> 012101210210202
<b>012</b> 101210210202
<b>012</b> 10210202
02
0202
<b>02</b> 10202
<b>1012</b> 012101210210202
<b>1012</b> 10210202
10202
<b>102</b> 10202
<b>12</b> 012101210210202
<b>12</b> 101210210202
<b>12</b> 10210202
2
<b>2</b> 012101210210202
<b>2</b> 02
<b>2</b> 1012012101210210202
<b>2</b> 101210210202
<b>2</b> 10202
<b>2</b> 10210202

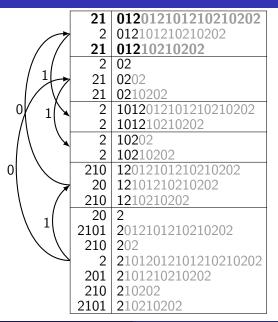
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	02
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	10202
	<b>102</b> 10202
	<b>12</b> 012101210210202
	<b>12</b> 101210210202
	<b>12</b> 10210202
20	2
2101	<b>2</b> 012101210210202
210	<b>2</b> 02
2	<b>2</b> 1012012101210210202
201	<b>2</b> 101210210202
210	<b>2</b> 10202
2101	<b>2</b> 10210202

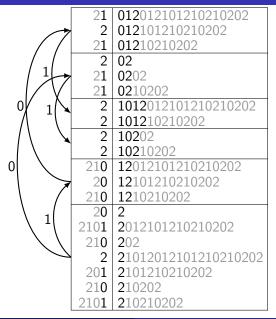




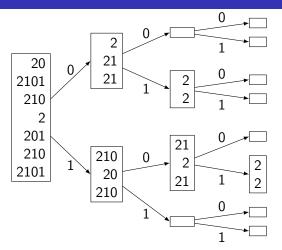




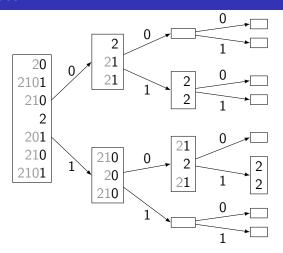




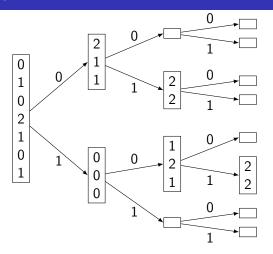
#### Wavelet Trees



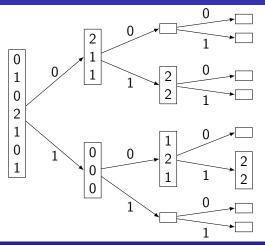
### Wavelet Trees



# Wavelet Trees



### Wavelet Trees



### Theorem (Munro et al., SPIRE'14; Babenko et al., SODA'15)

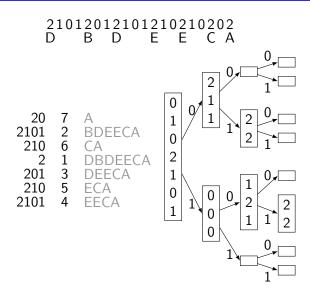
The wavelet tree of a sequence of m items with b bits each can be computed in  $\mathcal{O}(mb/\sqrt{\log m})$  time using  $\mathcal{O}(mb/\log m)$  space.

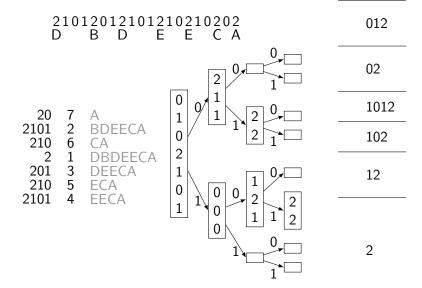
21012012101210210202

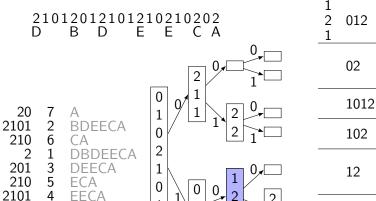
- 7 A
  2 BDEECA
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  1 DBDEECA
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  5 ECA
- - DBDEECA

- EECA

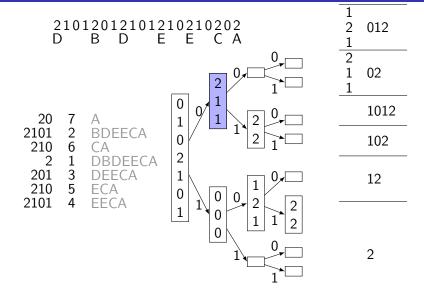
```
20 7 A
2101 2 BDEECA
210 6 CA
2 1 DBDEECA
201 3 DEECA
210 5 ECA
2101 4 FECA
```

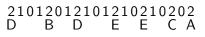




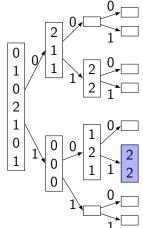


1



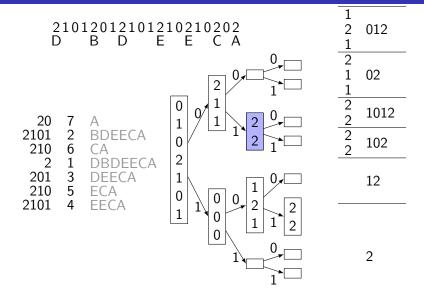


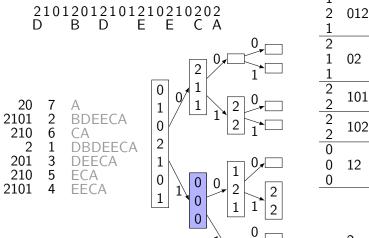
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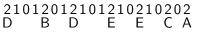


1 2 1 2	012
1	02
1 2 2	1012
	102
	12

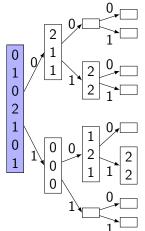
2







20 7 A 2101 2 BDEECA 210 6 CA 2 1 DBDEECA 201 3 DEECA 210 5 ECA 2101 4 EECA



1 2 1	012
1 2 1 1	02
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2 2	102
1 2 2 2 2 0 0 0 0	12
0 1 0 2 1 0	2

# String Synchronizing Sets

A  $\tau$ -synchronizing set of T is a set of positions S that is

```
small: |S| = \mathcal{O}(\frac{n}{\tau});
```

consistent: whether  $i \in S$  depends only on  $T[i ... i + 2\tau - 1]$ ,

dense:  $S \cap [i ... i + \tau - 1] \neq \emptyset$  for  $i \in [1 ... n - 3\tau + 2]$ .

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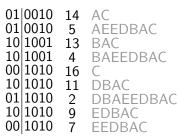
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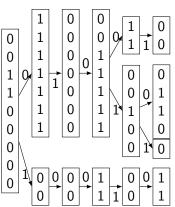
### Theorem

Given a text T and a positive integer  $\tau$ , one can deterministically construct a  $\tau$ -synchronizing set of size  $\mathcal{O}(\frac{n}{\tau})$ :

- in  $\mathcal{O}(n)$  time in general,
- in  $\mathcal{O}(\frac{n}{\tau})$  time if  $\tau \leqslant \frac{1}{5} \log_{\sigma} n$ .







0	0
1	00
1 1	0010
1	0100
1 1	01001
0 1 1 0	01010
0	100
0	1001
0 0 1 0 0	1010
0	11010

### Conclusions

### **Our contributions:**

- **I** BWT construction:  $\mathcal{O}(n \log \sigma / \sqrt{\log n})$  time,  $\mathcal{O}(n / \log_{\sigma} n)$  space.
- **2** LCE queries in  $\mathcal{O}(1)$  time after  $\mathcal{O}(n/\log_{\sigma} n)$ -time preprocessing.
- **3** The notion of  $\tau$ -synchronizing sets.

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#### Further work:

- **1** Lower bounds for BWT construction with any alphabet size  $\sigma$ .
- 2 Sublinear-time construction of further objects.
- 3 External-memory counterpart.
- 4 Improve the running time wrt. more subtle instance size measures.

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# Thank you for your attention!