

On Bijective Variants of the Burrows-Wheeler Transform

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Burrows-Wheeler transform

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 - + index of input within this list

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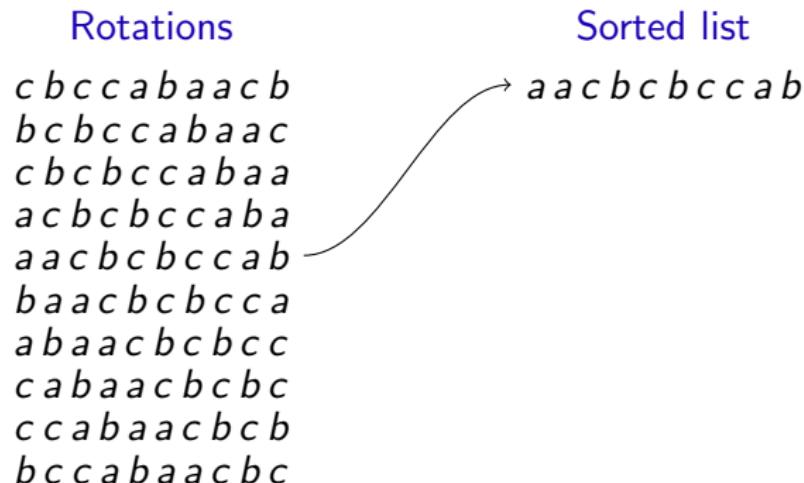
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Rotations

*c b c c a b a a c b
b c b c c a b a a c
c b c b c c a b a a
a c b c b c c a b a
a a c b c b c c a b
b a a c b c b c c a
a b a a c b c b c c
c a b a a c b c b c
c c a b a a c b c b
b c c a b a a c b c*

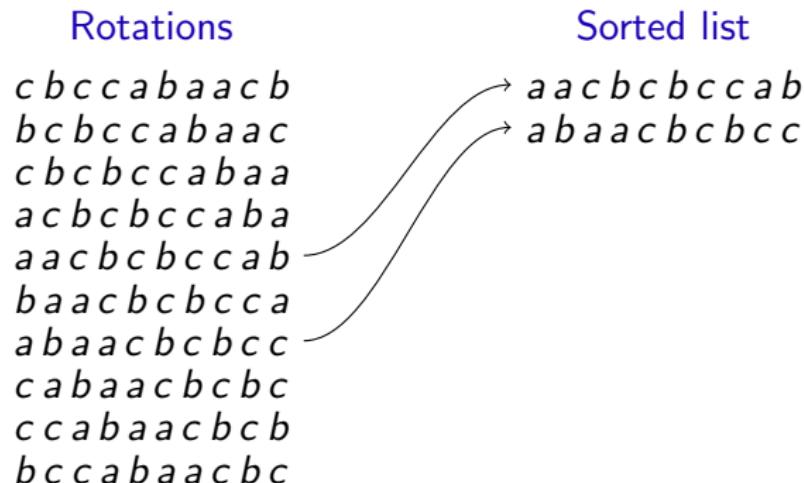
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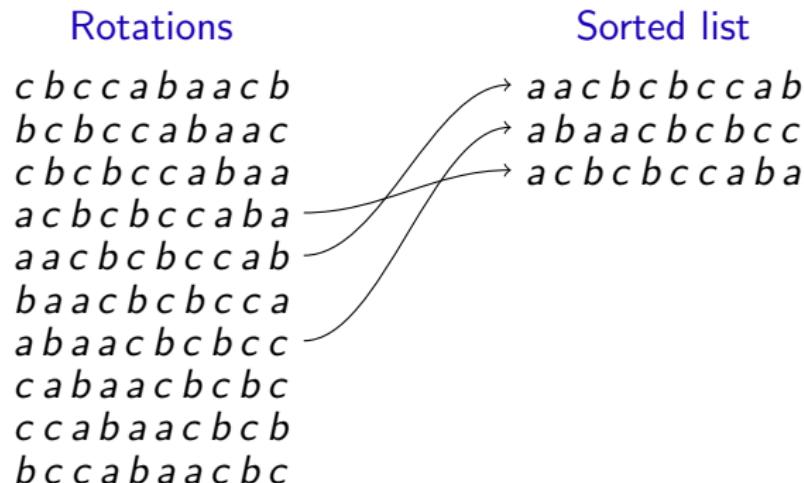
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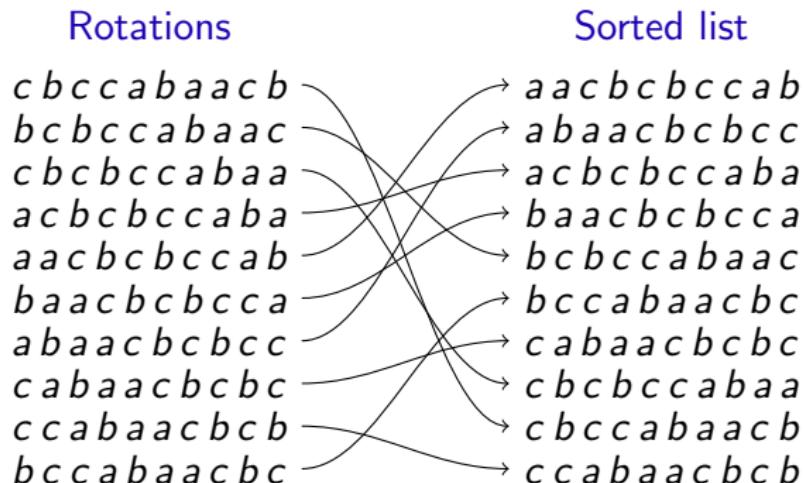
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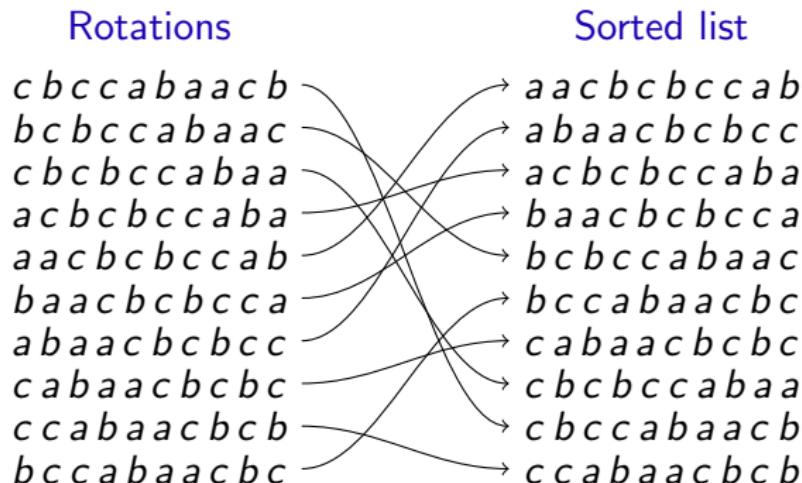
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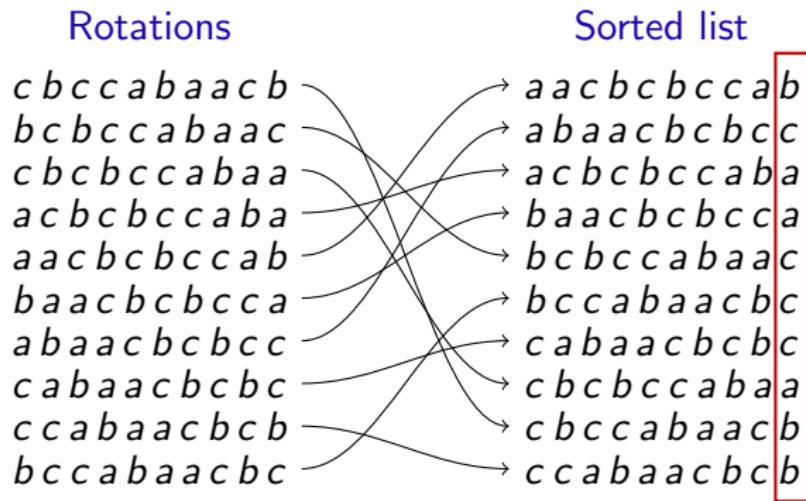
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Output: $\text{BWT}(w) = (\quad , \quad)$

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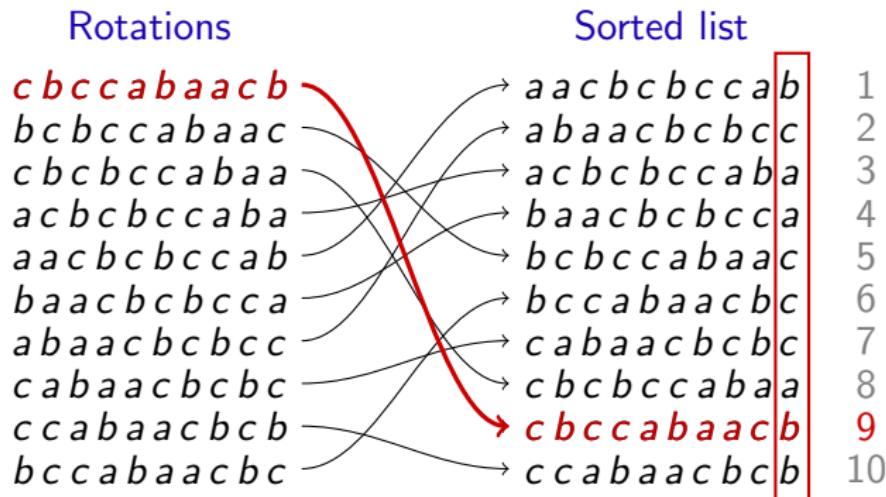
- ▶ Last column of sorted list of rotations
+ index of input within this list
- ▶ Example $w = cbccabaaab$



Output: $\text{BWT}(w) = (bcaaccabb,)$

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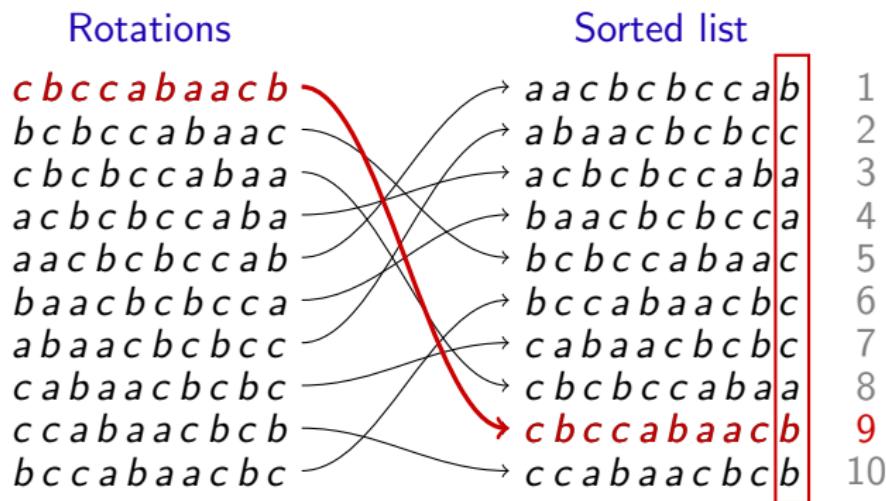
- ▶ Last column of sorted list of rotations
+ index of input within this list
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Output: $\text{BWT}(w) = (bcaaccabb, 9)$

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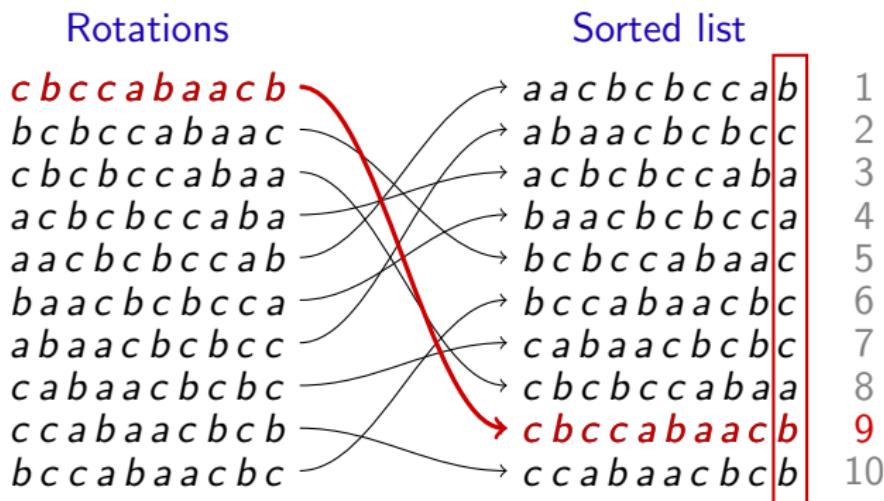


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- ▶ For typical inputs w : $\text{BWT}(w)$ is easier to compress

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Output: $\text{BWT}(w) = (bcaaccabb, 9)$

- ▶ For typical inputs w : $\text{BWT}(w)$ is easier to compress
- ▶ BWT is not surjective

Inverting the BWT

- ▶ $\text{BWT}(w) = (bcaacccabb, 9)$

Inverting the BWT

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b
c
a
a
c
c
c
a
b
b

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- ▶ $\text{BWT}(w) = (bcaacccabb, 9)$

b
c
a
a
c
c
c
a
b
b

Inverting the BWT

- ▶ $\text{BWT}(w) = (bcaacccabb, 9)$

<i>b</i>	a
<i>c</i>	a
<i>a</i>	a
<i>a</i>	b
<i>c</i>	b
<i>c</i>	b
<i>c</i>	c
<i>a</i>	c
<i>b</i>	c
<i>b</i>	c

Inverting the BWT

- ▶ $\text{BWT}(w) = (bcaacccabb, 9)$

<i>b</i>	a a
<i>c</i>	a b
<i>a</i>	a c
<i>a</i>	b a
<i>c</i>	b c
<i>c</i>	b c
<i>c</i>	c a
<i>a</i>	c b
<i>b</i>	c b
<i>b</i>	c c

Inverting the BWT

- ▶ $\text{BWT}(w) = (bcaacccabb, 9)$

<i>b</i>	a a c
<i>c</i>	a b a
<i>a</i>	a c b
<i>a</i>	b a a
<i>c</i>	b c b
<i>c</i>	b c c
<i>c</i>	c a b
<i>a</i>	c b c
<i>b</i>	c b c
<i>b</i>	c c a

Inverting the BWT

- ▶ $\text{BWT}(w) = (bcaacccabb, 9)$

Sorted list

<i>b</i>	a a c b c b c c a b
<i>c</i>	a b a a c b c b c c
<i>a</i>	a c b c b c c a b a
<i>a</i>	b a a c b c b c c a
<i>c</i>	b c b c c a b a a c
<i>c</i>	b c c a b a a c b c
<i>c</i>	c a b a a c b c b c
<i>a</i>	c b c b c c a b a a
<i>b</i>	c b c c a b a a c b
<i>b</i>	c c a b a a c b c b

Inverting the BWT

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Sorted list

b	a a c b c b c c a b
c	a b a a c b c b c c
a	a c b c b c c a b a
a	b a a c b c b c c a
c	b c b c c a b a a c
c	b c c a b a a c b c
c	c a b a a c b c b c
a	c b c b c c a b a a
b	c b c c a b a a c b
b	c c a b a a c b c b

w

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b	a a c b c b c c a b
c	a b a a c b c b c c
a	a c b c b c c a b a
a	b a a c b c b c c a
c	b c b c c a b a a c
c	b c c a b a a c b c
c	c a b a a c b c b c
a	c b c b c c a b a a
b	c b c c a b a a c b
b	c c a b a a c b c b

w

- ▶ BWT is injective

The bijective BWT

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Rotations

*a a c b
b a a c
c b a a
a c b a*

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Rotations

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b a a c
c b a a
a c b a
a b
b a*

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Rotations

a a c b
b a a c
c b a a
a c b a
a b
b a
b c c
c b c
c c b
c

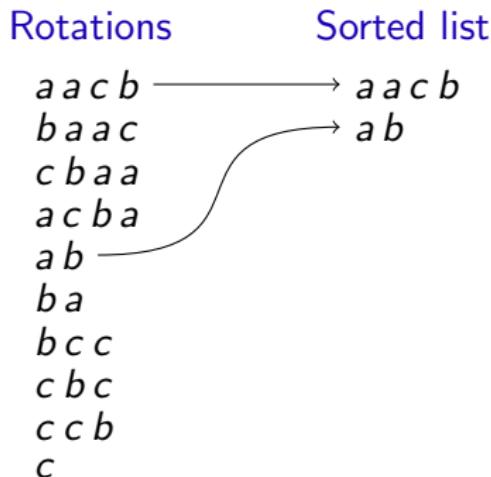
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Rotations	Sorted list
$a a c b$	$a a c b$
$b a a c$	
$c b a a$	
$a c b a$	
$a b$	
$b a$	
$b c c$	
$c b c$	
$c c b$	
c	

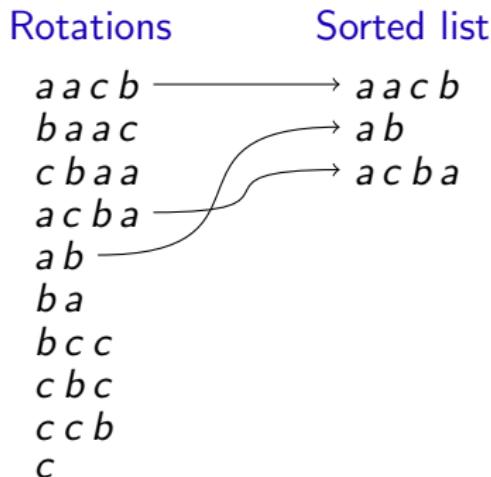
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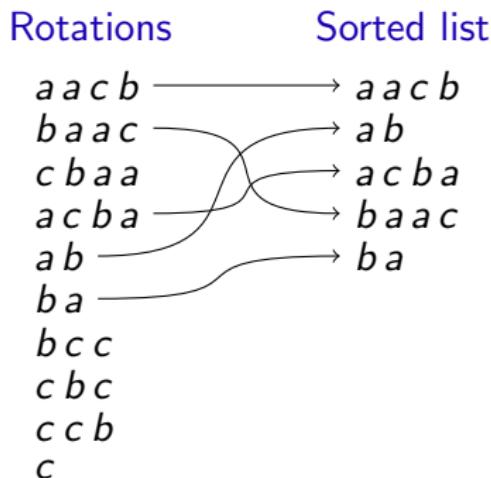
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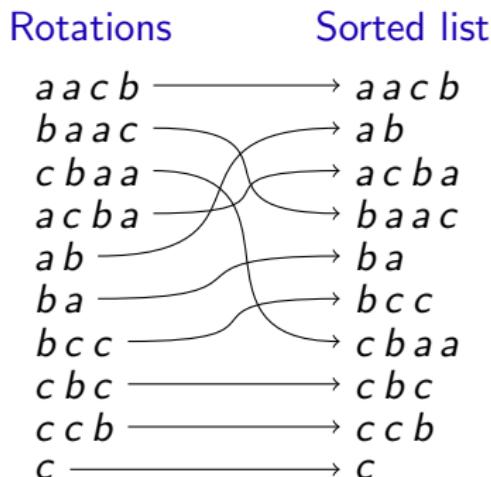
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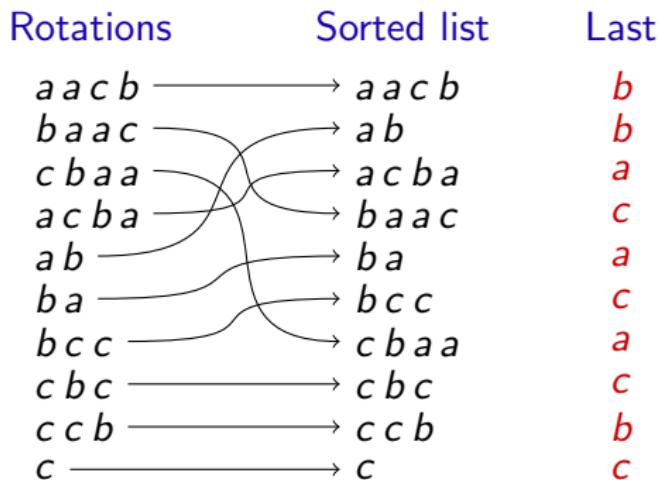
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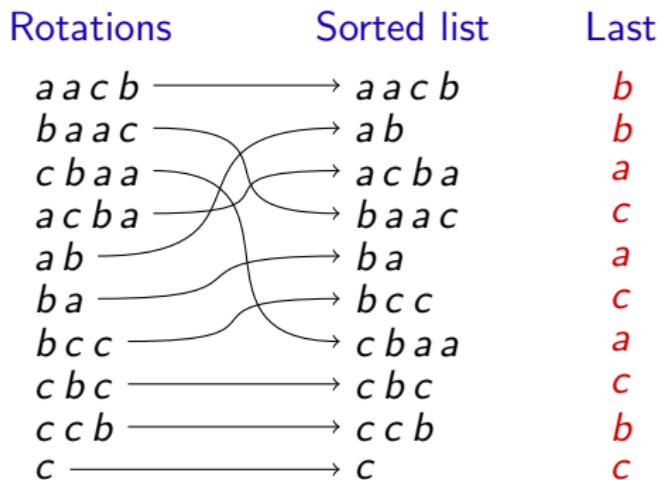
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- ▶ $BWTS(w) = bbacacacabc$, no index required

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacbc$

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- ▶ $\text{BWTS}(w) = bbacacacbc$

<i>b</i>
<i>b</i>
<i>a</i>
<i>c</i>
<i>a</i>
<i>c</i>
<i>a</i>
<i>c</i>
<i>b</i>
<i>c</i>

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacbc$

b	a
b	a
a	a
c	b
a	b
c	b
a	c
c	c
b	c
c	c

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacbc$

b	a a
b	a b
a	a c
c	b a
a	b a
c	b c
a	c b
c	c b
b	c c
c	c c

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacbc$

b	a a c
b	a b a
a	a c b
c	b a a
a	b a b
c	b c c
a	c b a
c	c b c
b	c c b
c	c c c

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

b	a a c b a a c b a a
b	a b a b a b a b a b
a	a c b a a c b a a c
c	b a a c b a a c b a
a	b a b a b a b a b a
c	b c c b c c b c c b
a	c b a a c b a a c b
c	c b c c b c c b c c
b	c c b c c b c c b c
c	c c c c c c c c c c

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b	a b a b a b a b a b
a	a c b a a c b a a c
c	b a a c b a a c b a
a	b a b a b a b a b a b a
c	b c c b c c b c c b
a	c b a a c b a a c b
c	c b c c b c c b c c
b	c c b c c b c c b c
c	c c c c c c c c c c

periods/cycles

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

b	a a c b a a c b a a
b	a b a b a b a b a b
a	a c b a a c b a a c
c	b a a c b a a c b a
a	b a b a b a b a b a b a
c	b c c b c c b c c b
a	c b a a c b a a c b
c	c b c c b c c b c c
b	c c b c c b c c b c
c	c c c c c c c c c c

periods/cycles

- ▶ $w =$

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

b	a a c b a a c b a a	←
b	a b a b a b a b a b	
a	a c b a a c b a a c	
c	b a a c b a a c b a	
a	b a b a b a b a b a b a	
c	b c c b c c b c c b	
a	c b a a c b a a c b	
c	c b c c b c c b c c	
b	c c b c c b c c b c	
c	c c c c c c c c c c	

periods/cycles

- ▶ $w = aacb$

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

b	a a c b a a c b a a	←
b	a b a b a b a b a b	←
a	a c b a a c b a a c	
c	b a a c b a a c b a	
a	b a b a b a b a b a b a	
c	b c c b c c b c c b	
a	c b a a c b a a c b	
c	c b c c b c c b c c	
b	c c b c c b c c b c	
c	c c c c c c c c c c	

periods/cycles

- ▶ $w = ab \cdot aacb$

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

b	a a c b a a c b a a	←
b	a b a b a b a b a b	←
a	a c b a a c b a a c	
c	b a a c b a a c b a	
a	b a b a b a b a b a b a	
c	b c c b c c b c c b	←
a	c b a a c b a a c b	
c	c b c c b c c b c c	
b	c c b c c b c c b c c b c	
c	c c c c c c c c c c	

periods/cycles

- ▶ $w = bcc \cdot ab \cdot aacb$

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

b	a a c b a a c b a a	←
b	a b a b a b a b a b	←
a	a c b a a c b a a c	
c	b a a c b a a c b a	
a	b a b a b a b a b a b a	
c	b c c b c c b c c b	←
a	c b a a c b a a c b	
c	c b c c b c c b c c	
b	c c b c c b c c b c c	
c	c c c c c c c c c c ←	

periods/cycles

- ▶ $w = c \cdot bcc \cdot ab \cdot aacb$

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

<i>b</i>	a a c b a a c b a a	←
<i>b</i>	b a b a b a b a b	←
<i>a</i>	a c b a a c b a a c	
<i>c</i>	b a a c b a a c b a	
<i>a</i>	b a b a b a b a b a	
<i>c</i>	b c c b c c b c c b	←
<i>a</i>	c b a a c b a a c b	
<i>c</i>	c b c c b c c b c c	
<i>b</i>	c c b c c b c c b c	
<i>c</i>	c c c c c c c c c c	←

periods/cycles

- ▶ $w = c \cdot bcc \cdot ab \cdot aacb$
- ▶ BWTS is bijective

Inverting the BWTS

- ▶ $\text{BWTS}(w) = bbacacacabc$

Sorted list

<i>b</i>	a a c b a a c b a a	←
<i>b</i>	b a b a b a b a b	←
<i>a</i>	a c b a a c b a a c	
<i>c</i>	b a a c b a a c b a	
<i>a</i>	b a b a b a b a b a	
<i>c</i>	b c c b c c b c c b	←
<i>a</i>	c b a a c b a a c b	
<i>c</i>	c b c c b c c b c c	
<i>b</i>	c c b c c b c c b c	
<i>c</i>	c c c c c c c c c c	←

periods/cycles

- ▶ $w = c \cdot bcc \cdot ab \cdot aacb$
- ▶ BWTS is bijective
- ▶ In fact, BWTS recovers the Lyndon factorization.

Historical remarks about the bijective BWT

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multi-word BWT, application: divide input into blocks
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- ▶ Scott (2007):
apply multi-word BWT to blocks obtained by
Lyndon factorization, no indices necessary
(example, computer program, but no formal proof)

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- ▶ Gil and Scott (2009, independently of this paper):
full description / formal proof of the bijective BWT,
test results

Sort transform

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- ▶ Example $w = cbccabaacb$, order 2

Sort transform

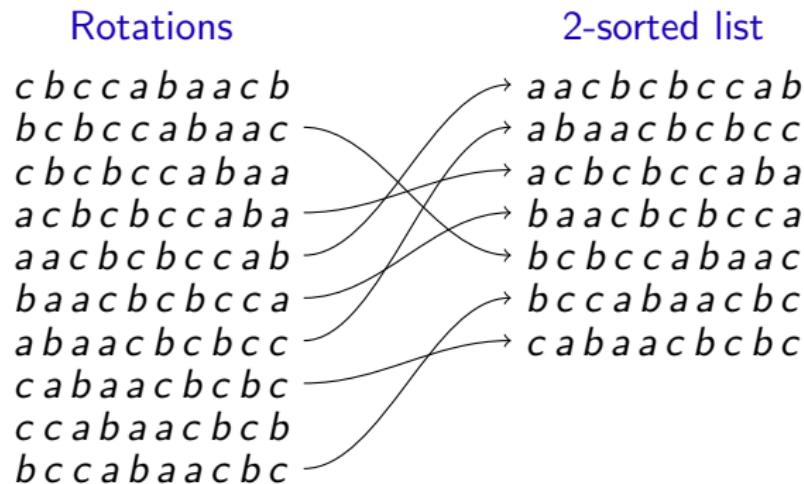
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Rotations

$c b c c a b a a c b$
 $b c b c c a b a a c$
 $c b c b c c a b a a$
 $a c b c b c c a b a$
 $a a c b c b c c a b$
 $b a a c b c b c c a$
 $a b a a c b c b c c$
 $c a b a a c b c b c$
 $c c a b a a c b c b$
 $b c c a b a a c b c$

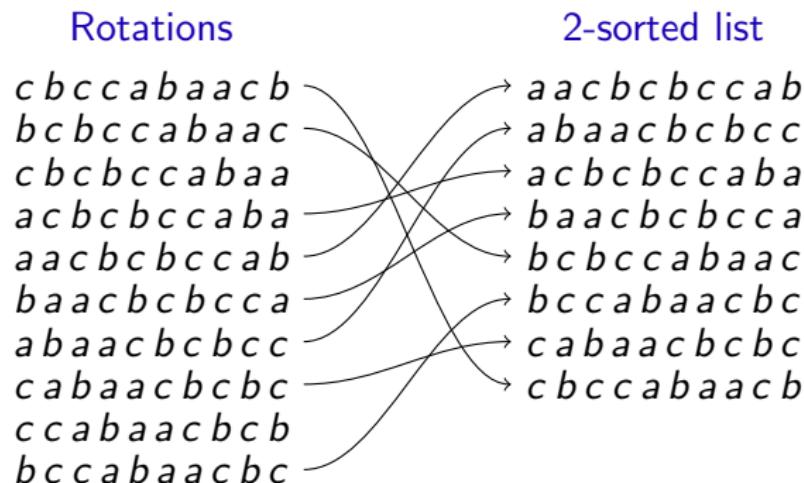
Sort transform

- ▶ Discovered by Schindler (1997)
- ▶ Nong, Zhang, and Chan (2006/2007/2008):
fast algorithms for the inverse
- ▶ Example $w = cbccabaacb$, order 2



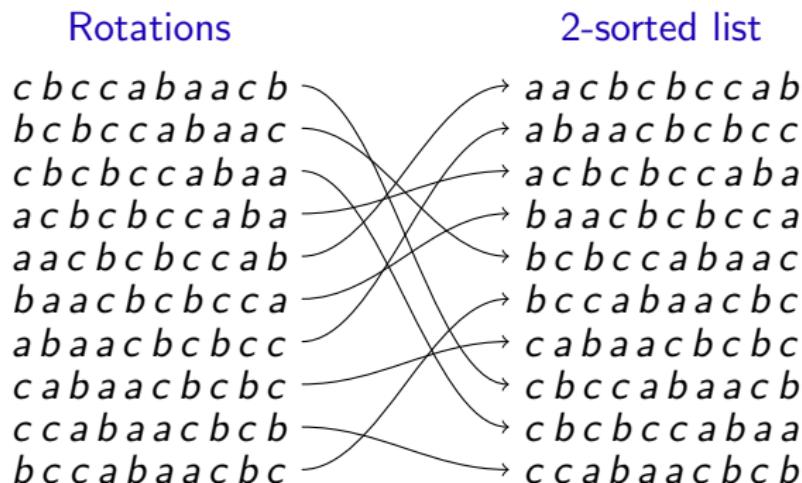
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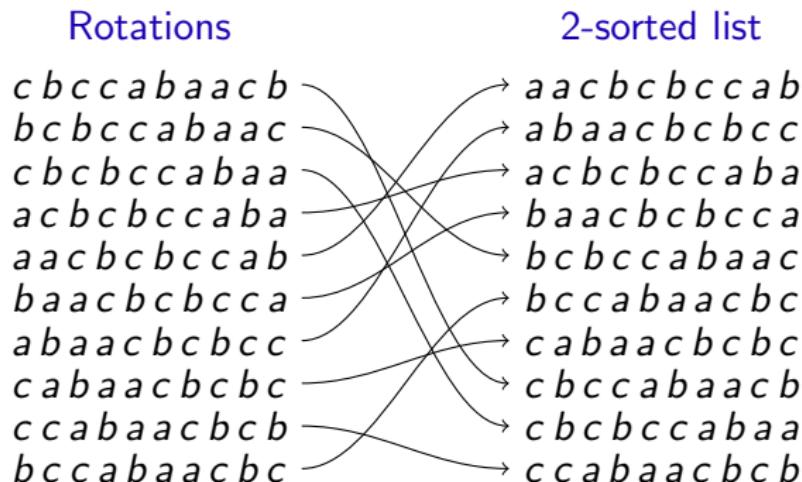
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Sort transform

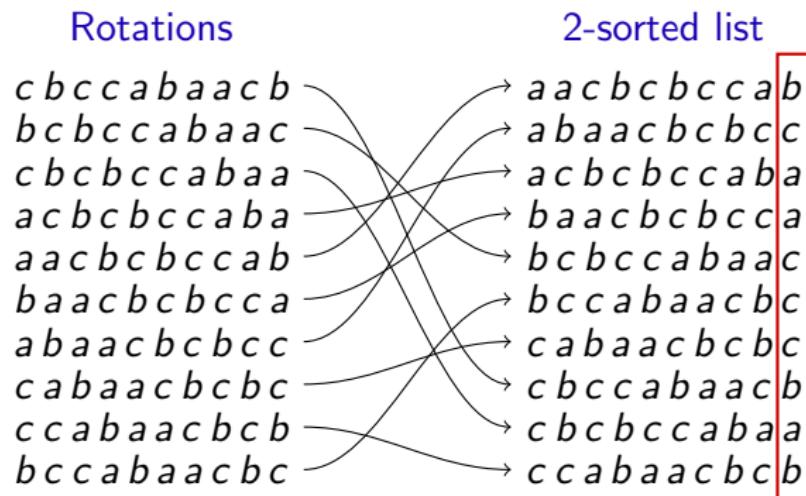
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Output: $ST_2(w) = (\quad , \quad)$

Sort transform

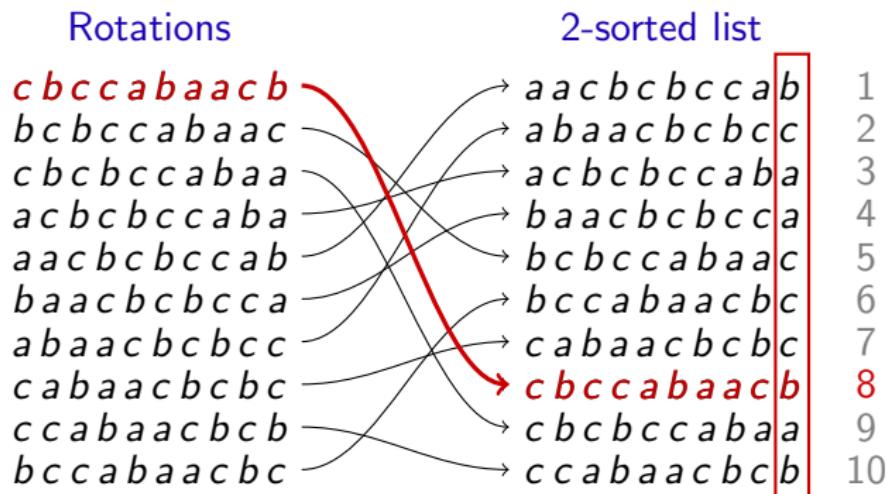
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- ▶ Example $w = cbccabaacb$, order 2



Output: $ST_2(w) = (bcaaccbab,)$

Sort transform

- ▶ Discovered by Schindler (1997)
- ▶ Nong, Zhang, and Chan (2006/2007/2008):
fast algorithms for the inverse
- ▶ Example $w = cbccabaacb$, order 2



Output: $ST_2(w) = (bcaaccbab, 8)$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

b
c
a
a
c
c
c
b
a
b

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

b	a
c	a
a	a
a	b
c	b
c	b
c	c
b	c
a	c
b	c

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b
a	c b
b	c c

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b
a	c b
b	c c

$w =$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b ← start
a	c b
b	c c

$w =$ | cb

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b ← start
a	c b
b	c c

$$w = \quad b \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b ← start
a	c b
b	c c

$$w = \quad cb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b ← start
a	c b
b	c c

$$w = \quad acb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a a
c	a b
a	a c
a	b a
c	b c
c	b c
c	c a
b	c b ← start
a	c b
b	c c

$$w = \quad aacb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a	a
c	a	b
a	a	c
a	b	a
c	b	c
c	b	c
c	c	a
b	c	b
a	c	b
b	c	c

← start

$$w = \quad baacb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

b	a	a
c	a	b
a	a	c
a	b	a
c	b	c
c	b	c
c	c	a
b	c	b
a	c	b
b	c	c

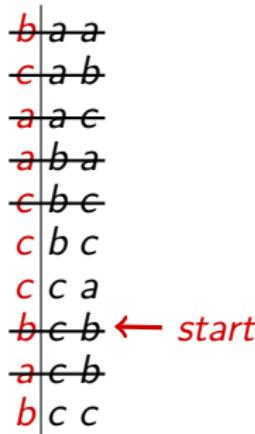
← start

$$w = \quad abaacb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

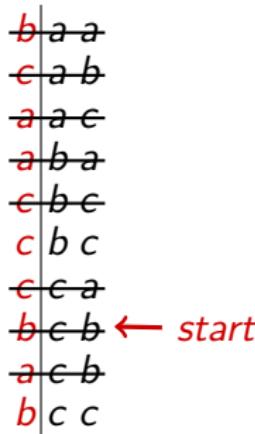


$$w = \quad cabaacb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

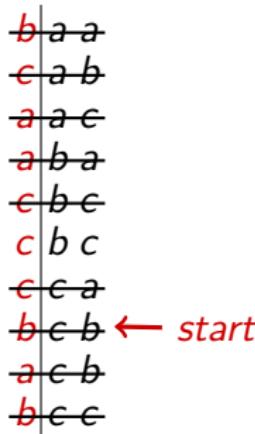


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Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

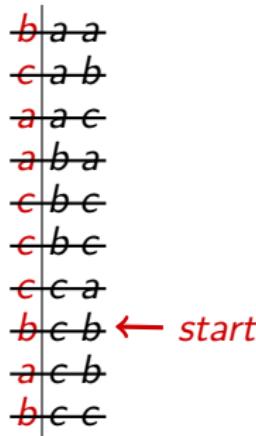


$$w = \quad bccabaacb \mid cb$$

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts

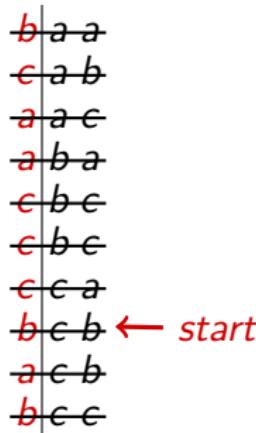


$$w = cbccabaacb \mid cb$$

Inverting the ST

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2-contexts



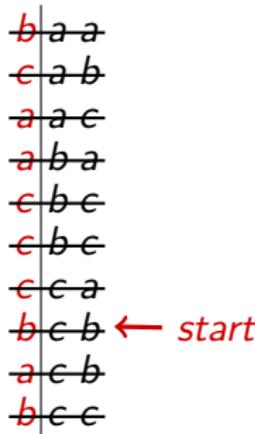
$$w = cbccabaacb \mid cb$$

- ▶ ST is injective

Inverting the ST

- ▶ $\text{ST}_2(w) = (bcaacccbab, 8)$

2-contexts



$$w = cbccabaacb \mid cb$$

- ▶ ST is injective
- ▶ ST_0 is reversal

The bijective ST

- ▶ Lyndon factorization followed by multi-word ST

The bijective ST

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- ▶ Example: $w = cbccabaaacb$

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- ▶ Sort order \preceq : $u \preceq v$ if $u^\omega \leq v^\omega$

The bijective ST

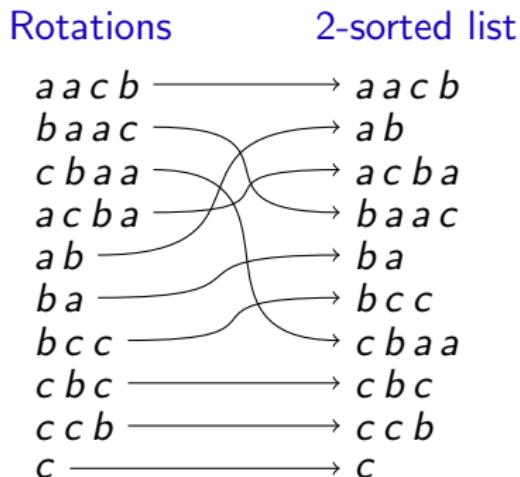
- ▶ Lyndon factorization followed by multi-word ST
- ▶ Example: $w = cbccabaaacb$
- ▶ Lyndon factorization: $w = c \cdot bcc \cdot ab \cdot aacb$
- ▶ Sort order \preceq : $u \preceq v$ if $u^\omega \leq v^\omega$

Rotations

a a c b
b a a c
c b a a
a c b a
a b
b a
b c c
c b c
c c b
c

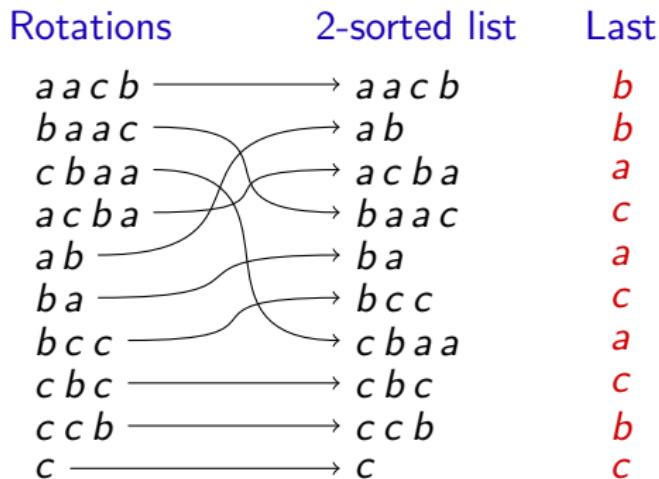
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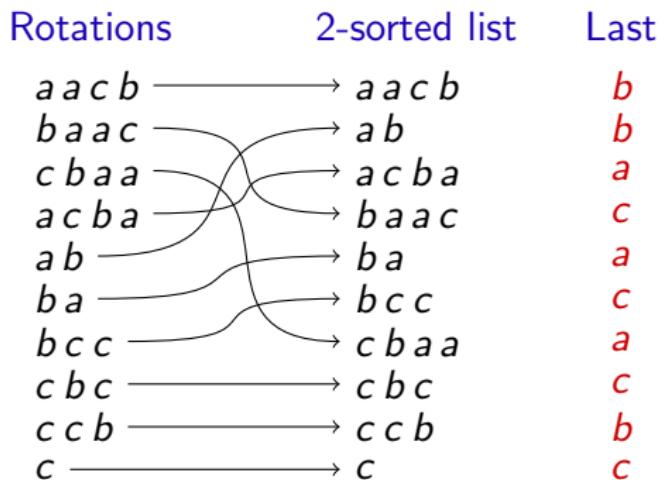
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- ▶ Sort order \preceq : $u \preceq v$ if $u^\omega \leq v^\omega$



The bijective ST

- ▶ Lyndon factorization followed by multi-word ST
- ▶ Example: $w = cbccabaaacb$
- ▶ Lyndon factorization: $w = c \cdot bcc \cdot ab \cdot aacb$
- ▶ Sort order \preceq : $u \preceq v$ if $u^\omega \leq v^\omega$



- ▶ $LST_2(w) = bbacacacabc$, no index required

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

b
b
a
c
a
c
a
c
b
c

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

b	a
b	a
a	a
c	b
a	b
c	b
a	c
c	c
b	c
c	c

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a a
b	a b
a	a c
c	b a
a	b a
c	b c
a	c b
c	c b
b	c c
c	c c

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a a
b	a b
a	a c
c	b a
a	b a
c	b c
a	c b
c	c b
b	c c
c	c c

$w =$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a a	← start
b	a b	
a	a c	
c	b a	
a	b a	
c	b c	
a	c b	
c	c b	
b	c c	
c	c c	

$w =$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	
a	a	c	
c	b	a	
a	b	a	
c	b	c	
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \quad b$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	
a	a	c	
c	b	a	
a	b	a	
c	b	c	
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \quad cb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	
a	a	c	
c	b	a	
a	b	a	
c	b	c	
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \quad acb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

<u>b</u>	a	a	← start
<u>b</u>	a	b	
<u>a</u>	a	c	
<u>c</u>	b	a	
<u>a</u>	b	a	
<u>c</u>	b	c	
<u>a</u>	c	b	
<u>c</u>	c	b	
<u>b</u>	c	c	
<u>c</u>	c	c	

$$w = \quad aacbc$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \cdot aacbc$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

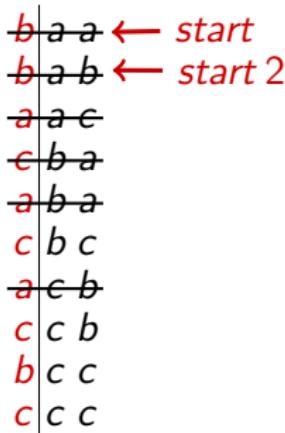
b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \quad b \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts



$$w = ab \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \quad \cdot ab \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = \quad c \cdot ab \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = cc \cdot ab \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	

$$w = bcc \cdot ab \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	← start 4

$$w = c \cdot bcc \cdot ab \cdot aacb$$

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	← start 4

$$w = c \cdot bcc \cdot ab \cdot aacb$$

- ▶ In general, LST does not recover Lyndon factorization.

Inverting the LST

- ▶ $\text{LST}_2(w) = bbacacacbc$

2-contexts

b	a	a	← start
b	a	b	← start 2
a	a	c	
c	b	a	
a	b	a	
c	b	c	← start 3
a	c	b	
c	c	b	
b	c	c	
c	c	c	← start 4

$$w = c \cdot bcc \cdot ab \cdot aacb$$

- ▶ In general, LST does not recover Lyndon factorization.
- ▶ LST_0 is reversal

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$
rotations

acacacabc
cacacacab
bcacacac
cbcacaca
acbcacac
cacbcaca
acacbcac
cacacbca
 b
 b

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted
$acacacacbc$	$acacacacbc$
$cacacacacb$	$acacacbcac$
$bcacacacac$	$acbcacacac$
$cbcacacaca$	b
$acbcacacac$	b
$cacbcacaca$	$bcacacacac$
$acacbcacac$	$cacacacacb$
$cacacacbcac$	$cacacacbcac$
b	$cacbcacaca$
b	$cbcacacaca$

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS
acacacacbc	acacacacbc	c
cacacacab	acacbcac	c
bcaacacac	acbcacac	c
cbcacaca	b	b
acbcacac	b	b
cacbcaca	bcacacac	c
acacbcac	cacacacb	b
cacacbca	cacacbca	a
b	cacbcaca	a
b	cbcacaca	a

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS	1-sorted
acacacacbc	acacacacbc	c	acacacacbc
cacacacacb	acacbcac	c	acbcacac
bcacacacac	acbcacac	c	acacbcac
cbcacacaca	b	b	bcacacac
acbcacacac	b	b	b
cacbcacaca	bcacacac	c	b
acacbcacac	cacacacb	b	cacacacb
cacacbcaca	cacacbca	a	cbcacacaca
b	cacbcacaca	a	cacbcacaca
b	cbcacacaca	a	cacacbca

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS	1-sorted	ST_1
acacacacbc	acacacacbc	c	acacacacbc	c
cacacacacb	acacbcac	c	acbcacac	c
bcacacac	acbcacac	c	acacbcac	c
cbcacaca	b	b	bcacacac	c
acbcacac	b	b	b	b
cacbcaca	bcacacac	c	b	b
acacbcac	cacacacb	b	cacacacb	b
cacacbca	cacacbca	a	cbcacaca	a
b	cacbcaca	a	cacbcaca	a
b	cbcacaca	a	cacacbca	a

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS	1-sorted	ST_1
acacacabc	acacacabc	c	acacacabc	c
cacacacb	acacbcac	c	acbcacac	c
bcacacac	acbcacac	c	acacbcac	c
cbcacaca	b	b	bcacacac	c
acbcacac	b	b	b	b
cacbcaca	bcacacac	c	b	b
acacbcac	cacacacb	b	cacacacb	b
cacacbca	cacacbca	a	cbcacaca	a
b	cacbcaca	a	cacbcaca	a
b	cbcacaca	a	cacacbca	a

- ▶ $\text{BWTS}(\text{BWTS}(w)) = cccbbcbaaa$

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS	1-sorted	ST_1
acacacabc	acacacabc	c	acacacabc	c
cacacacb	acacbcac	c	acbcacac	c
bcacacac	acbcacac	c	acacbcac	c
cbcacaca	b	b	bcacacac	c
acbcacac	b	b	b	b
cacbcaca	bcacacac	c	b	b
acacbcac	cacacacb	b	cacacacb	b
cacacbca	cacacbca	a	cbcacaca	a
b	cacbcaca	a	cacbcaca	a
b	cbcacaca	a	cacacbca	a

- ▶ $\text{BWTS}(\text{BWTS}(w)) = cccbbcbaaa$
- ▶ $\text{ST}_1(\text{ST}_2(w)) = ccccbbbbaaa$

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS	1-sorted	ST_1
acacacabc	acacacabc	c	acacacabc	c
cacacacb	acacbcac	c	acbcacac	c
bcacacac	acbcacac	c	acacbcac	c
cbcacaca	b	b	bcacacac	c
acbcacac	b	b	b	b
cacbcaca	bcacacac	c	b	b
acacbcac	cacacacb	b	cacacacb	b
cacacbca	cacacbca	a	cbcacaca	a
b	cacbcaca	a	cacbcaca	a
b	cbcacaca	a	cacacbca	a

- ▶ $\text{BWTS}(\text{BWTS}(w)) = cccbbcbaaa$
- ▶ $\text{ST}_1(\text{ST}_2(w)) = ccccbbbbaaa$
- ▶ BWT / BWTS mixes letters within contexts

Comparison of BWTS and LST

- ▶ $w = cbccabaacb$
- ▶ $\text{BWTS}(w) = \text{LST}_2(w) = b \cdot b \cdot acacacbc$

rotations	sorted	BWTS	1-sorted	ST_1
acacacabc	acacacabc	c	acacacabc	c
cacacacb	acacbcac	c	acbcacac	c
bcacacac	acbcacac	c	acacbcac	c
cbcacaca	b	b	bcacacac	c
acbcacac	b	b	b	b
cacbcaca	bcacacac	c	b	b
acacbcac	cacacacb	b	cacacacb	b
cacacbca	cacacbca	a	cbcacaca	a
b	cacbcaca	a	cacbcaca	a
b	cbcacaca	a	cacacbca	a

- ▶ $\text{BWTS}(\text{BWTS}(w)) = cccbbcbaaa$
- ▶ $\text{ST}_1(\text{ST}_2(w)) = ccccbbbaaa$
- ▶ BWT / BWTS mixes letters within contexts
- ▶ $\text{ST}_k / \text{LST}_k$ preserves order within k -contexts

Open problems

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- ▶ Algorithmic aspects

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- ▶ Multiple application of transforms

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- ▶ Different orders for two main steps of BWTS

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Thank you!