# Constructing the Bijective BWT

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the BBWT is the BWT of the Lyndon factorization of an input text with respect to  $\leq_{\omega}$ 

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# Lyndon words

- a
- aabab

### Lyndon word is smaller than

- any proper suffix
- any rotation

## Lyndon words

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- aabab

### Lyndon word is smaller than

- any proper suffix
- any rotation

### not Lyndon words:

- abaab (rotation aabab smaller)
- abab (abab not smaller than suffix ab)

# Lyndon factorization [Chen+ '58]

- input: text  $T = T_1 T_2 \dots T_t$
- output: factorization  $T_1...T_t$  with
  - T<sub>x</sub> is Lyndon word
  - $-T_x \ge_{\mathsf{lex}} T_{x+1}$
  - factorization uniquely defined
  - linear time [Duval'88]

(Chen-Fox-Lyndon Theorem)

### example

T = senescence

Lyndon factorization: s enes cen ce

- s, enes, cen, and ce are Lyndon
- s ><sub>lex</sub> enes ><sub>lex</sub> cen ≥<sub>lex</sub> ce

# $\prec_{\omega}$ order

•  $u <_{\omega} w : \iff uuuuu... <_{lex} wwww...$ 

- ab <<sub>lex</sub> aba
- aba ≺<sub>ω</sub> ab

# $\prec_{\omega}$ order

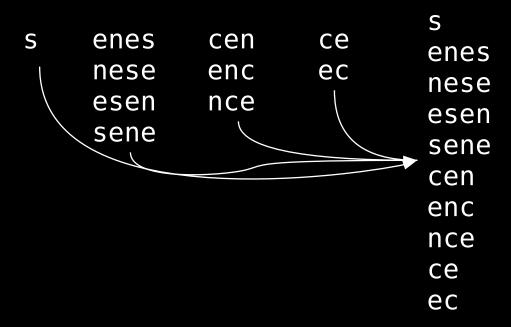
•  $u <_{\omega} w : \iff uuuuu ... <_{lex} wwww...$ 

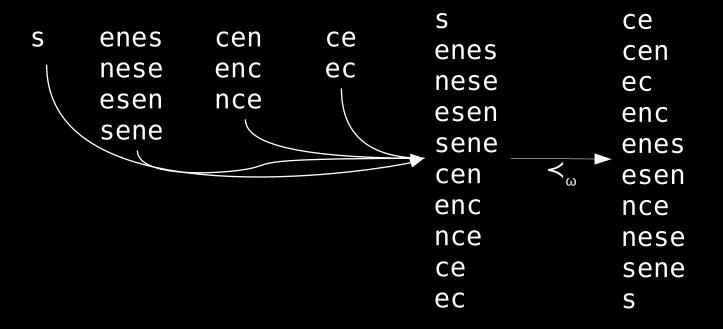
- ab < aba</li>
- aba ≺<sub>ω</sub> ab

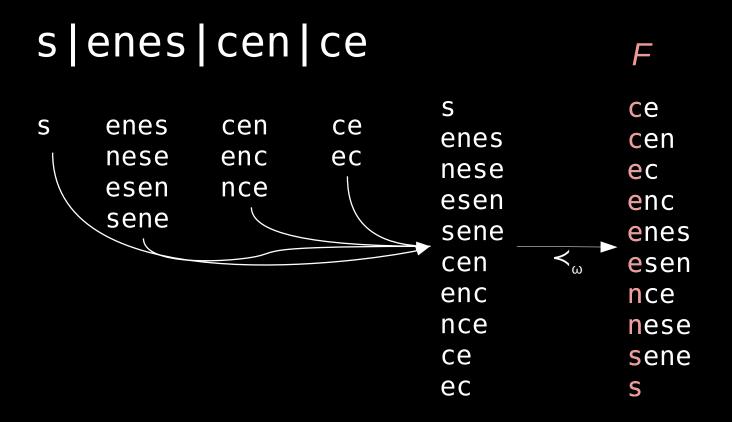
ab<mark>ababab...</mark> aba<mark>abaaba...</mark>

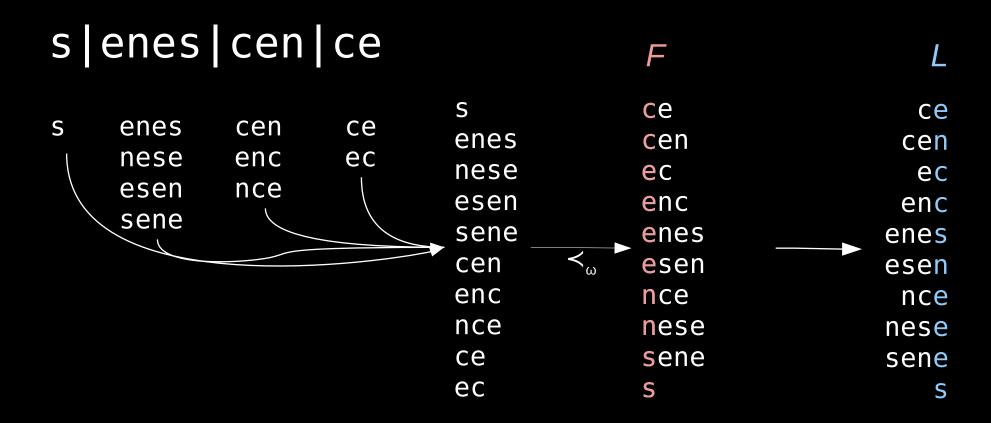
s | enes | cen | ce

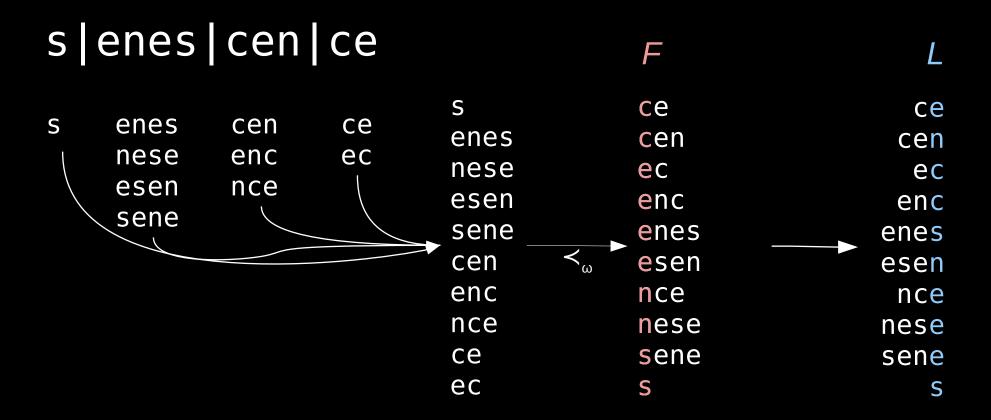
```
s enes cen ce
nese enc ec
esen nce
sene
```











result: enccsneees

### motivation

properties of BBWT:

- no \$ necessary
- BBWT is more compressible than BWT for various inputs

[Scott and Gill '12]

BBWT is indexible (full text index)

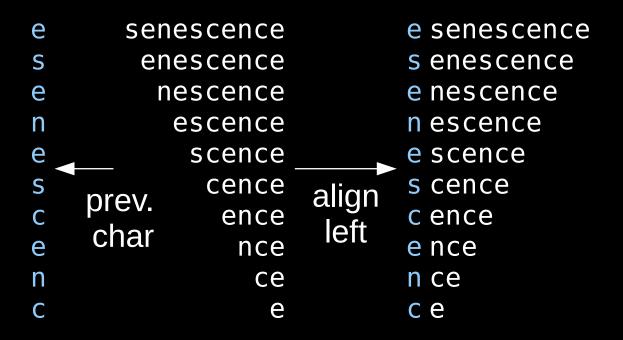
[Bannai+ '19]

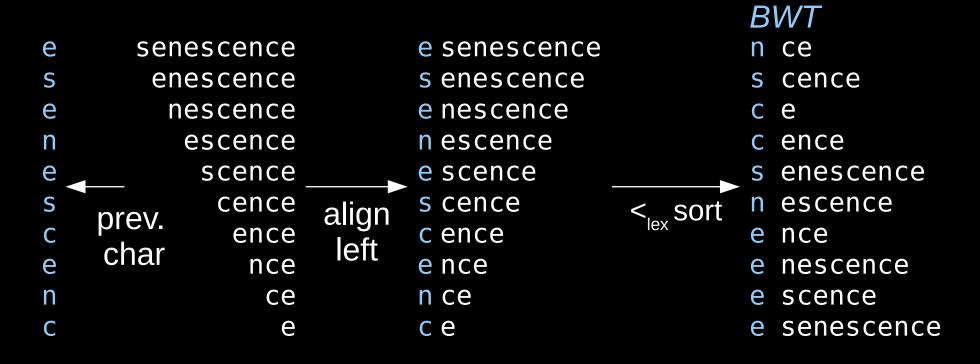
however, linear time construction was only conjectured!

### time

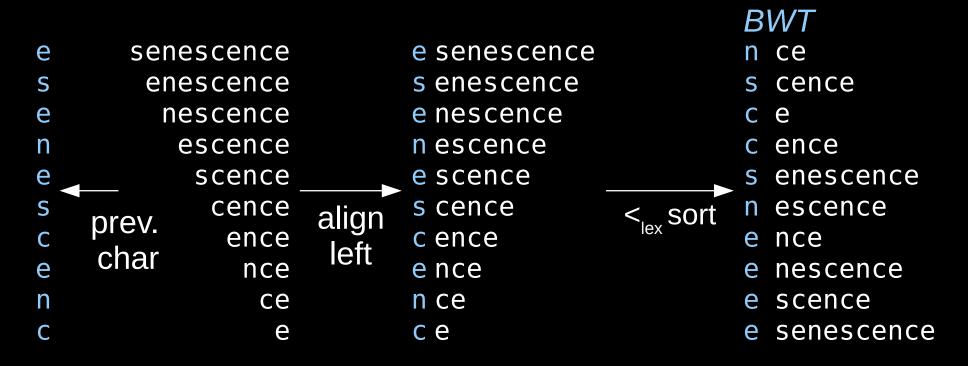
- how much time does it take to sort?
- #conjugates = number of text positions = n
  - $\Rightarrow$  naively:  $O(n^2)$  time
- can we use O(n) time suffix sorting?

```
senescence
e
        enescence
S
         nescence
e
n
          escence
e
           scence
S
            cence
    prev.
              ence
    char
e
               nce
n
                ce
C
                 e
```





#### senescence



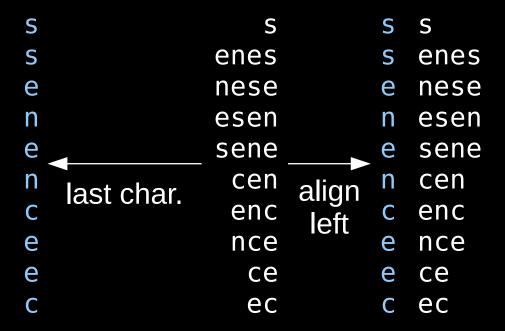
output: nsccsneeee (BBWT: enccsneees)

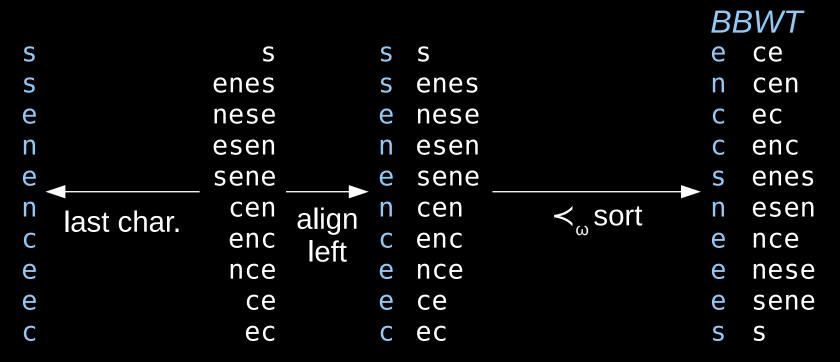
s | enes | cen | ce

### s | enes | cen | ce

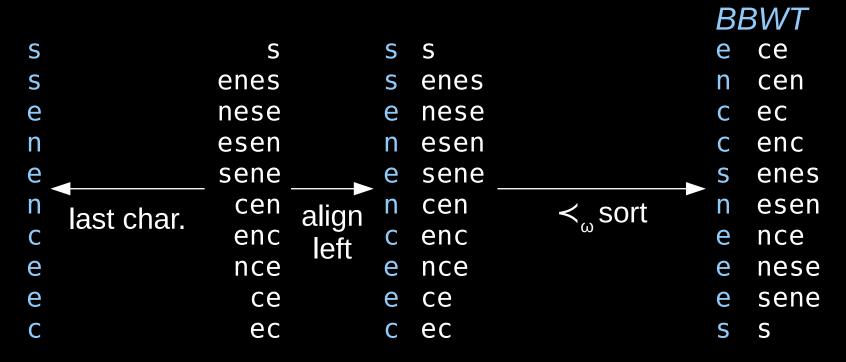
```
s
enes
nese
esen
sene
cen
enc
nce
ce
```

```
s s enes enes enes esen esen sene cen cen e ce ce c
```





### s | enes | cen | ce



output: enccsneees

### SA ⇒ BWT

- BWT[i] = T[SA[i]-1]
- SA[i] = starting position of the i the smallest suffix respective to lexicographic order

#### SAIS:

- famous linear time SA construction algorithm
- O(n) time for integer alphabets

### LSA ⇒ BBWT

- BBWT[i] = T[LSA[i]-1]
- LSA[i] = starting position of i th smallest conjucate respective to  $\prec_{\omega}$  order

[Hon+ '11]

#### LSAIS:

- LSA construction algorithm
- sorts conjugates instead of suffixes

$$T_1$$
  $T_2$   $T_3$   $T_4$   
1 1 2 3 4 1 2 3 1 2  
 $T = s e n e s c e n c e$ 

$$T_1$$
  $T_2$   $T_3$   $T_4$ 

1 1 2 3 4 1 2 3 1 2

 $T_4$ 
 $T_5$ 
 $T_4$ 
 $T_5$ 
 $T_5$ 
 $T_5$ 
 $T_6$ 
 $T_7$ 
 $T_8$ 
 $T_8$ 

• 
$$T_2[5] := T_2[1]$$

$$T_1$$
  $T_2$   $T_3$   $T_4$   
1 1 2 3 4 1 2 3 1 2  
 $T = s e n e s c e n c e$ 

- $T_2[5] := T_2[1]$
- $T_2[4..] := T_2[4]T_2[1]T_2[2]T_2[3]T_2[4]T_2[1]...$

$$T_1$$
  $T_2$   $T_3$   $T_4$   
1 1 2 3 4 1 2 3 1 2  
 $T = s e n e s c e n c e$ 

- $T_2[5] := T_2[1]$
- $T_2[4..] := T_2[4]T_2[1]T_2[2]T_2[3]T_2[4]T_2[1]...$

in general, for any *x* define:

- $-T_{x}[|T_{x}|+j] := T_{x}[(|T_{x}|+j-1) \mod |T_{x}|+1], j \ge 0$
- $T_{x}[0] := T_{x}[|T_{x}|]$
- $-T_{x}[i..] := T_{x}[i] ... T_{x}[|T_{x}|] T_{x}[1] ...$

# L/S type T<sub>1</sub> T<sub>2</sub> T<sub>3</sub> T<sub>4</sub> 1 1 2 3 4 1 2 3 1 2 T = s e n e s c e n c e

S L S L S S L

- $T_x[i] <_{\text{lex}} T_x[i+1] \Rightarrow T_x[i] \text{ is } S \text{ type}$
- $T_x[i] >_{lex} T_x[i+1] \Rightarrow T_x[i]$  is L type
- $T_x[i] = T_x[i+1] \Rightarrow T_x[i]$  and  $T_x[i+1]$  are same type

# L/S type $T_{1}$ $T_{2}$ $T_{3}$ $T_{4}$ 1 1 2 3 4 1 2 3 1 2 T = s e n e s c e n c e

- $T_x[i] <_{\text{lex}} T_x[i+1] \Rightarrow T_x[i]$  is S type
- $T_x[i] >_{lex} T_x[i+1] \Rightarrow T_x[i]$  is L type
- $T_x[i] = T_x[i+1] \Rightarrow T_x[i]$  and  $T_x[i+1]$  are same type

thanks to the Lyndon factorization the S / L types are the same as in the original SAIS

# S\* type T<sub>1</sub> T<sub>2</sub> T<sub>3</sub> T<sub>4</sub> 1 1 2 3 4 1 2 3 1 2 T = s e n e s c e n c e S\* S\* L S\* L S\* S L S\* L

- If  $T_x[i]$  is **S** type and  $T_x[i-1]$  is **L** type, then T[i] is **S**\* type
- $T_x[1]$  is always S\* type  $\forall x$

# LMS (substrings)

$$T = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10 \\ S & e & n & e & S & C & e & n & C & e \end{bmatrix}$$

#### for $1 \le i < j \le |T_x| + 1$ :

#### $T_x[i...j]$ is called LMS if

- $T_x[i]$  and  $T_x[j]$  are S\* type and
- $T_x[k]$  is S\* type  $\forall k \in [i+1 ... j-1]$

- 1 ss
- 2 ene
- 4 ese
- 6 cenc
- 9 cec

# LSAIS algorithm

- 1) sort all LMS
- 2) place S\* types
- 3) induce L types
- 4) induce S types

## sort all LMS

```
start pos. LMS
```

- 1 ss
- 2 ene
- 4 ese
- 6 cenc
- 9 cec

## sort all LMS

start pos. LMS

1 ss
2 ene
4 ese
6 cenc
6 cenc
9 cec
1 ss

# S/L type bucket allocation

$$T = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10 \\ S & e & n & e & S & c & e & n & c & e \\ S^* & S^* & L & S^* & L & S^* & S & L & S^* & L \end{bmatrix}$$

# place S\* types

```
pos. LMS
    cec
     cenc
                         2
                                                         10
                             3
                                 4
                                     5
                                         6
                                                 8
                                                     9
  2 ene
                     S
                         e
  4 ese
                     S*
                         S*
                                 S*
                                         S*
                                             S
                                                     S*
  1 ss
         LSA =
                          6
                                                          1
                                     4
                       S
                                                         S
                       \mathsf{C}
                                    e
                                               n
                                                        S
```

# induce L types

# induce S types

# BBWT[i] = T[LSA[i]-1]

# time analysis

#### SAIS

- sorts LMS recursively
- given SAIS needs  $\tau(n)$  time,  $\tau(n) = O(n) + \tau(n/2) = O(n)$  since the number of LMS  $\leq n/2$

#### **LSAIS**

- number of LMS can be  $\Theta(n)$  in all recursion steps
- still  $O(n^2)$  time?

```
T = b...baababaabab...aabab
b|...|b|aabab|aabab|...|aabab
```

```
T = b...baababaabab...aabab
b|...|b|aabab|aabab|...|aabab
LMS: _______ assign ranks according to lexicographic order
<math>-b \rightarrow 3
-aab \rightarrow 1
-ab \rightarrow 2
```

```
T = b...baababaabab...aabab
b | . . . | b | aabab | aabab | . . . | aabab
                        assign ranks according to
LMS: -
                         lexicographic order
-b \rightarrow 3
- aab → 1
- ab \rightarrow 2
3 | . . . . | 3 | 12 | 12 | . . . | 12 (recursion step)
```

```
T = b...baababaabab...aabab
b | ... | b | aabab | aabab | ... | aabab
                       assign ranks according to
LMS:
                       lexicographic order
-b \rightarrow 3
                         > same amount
- aab → 1
- ab → 2
3 | . . . . | 3 | 12 | 12 | . . . | 12 (recursion step)
```

```
T = b \dots baababaabab \dots aabab
b | . . . | b | aabab | aabab | . . . | aabab
                         assign ranks according to
LMS:
                         lexicographic order
-b \rightarrow 3
                            same amount
- aab → 1
- ab \rightarrow 2
3 | . . . . | 3 | 12 | 12 | . . . | 12 (recursion step)
```

same Lyndon factorization

#### lemma

- the string on the ranked LMS subtring has the same Lyndon factorization
- compared to any character c, all LMS starting with c are larger with respect to  $\prec_{\omega}$

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$$T_{1}$$
  $T_{2}$   $T_{3}$   $T_{4}$ 

1 2 3 4 5 6 7 8 9

 $T = \begin{bmatrix} s & e & n & e & s \\ s & s & L & s & L & s \end{bmatrix}$  C

#### lemma

- the string on the ranked LMS subtring has the same Lyndon factorization
- compared to any character c, all LMS starting with c are larger with respect to  $\prec_{\omega}$

$$T_1$$
  $T_2$   $T_3$   $T_4$   
1 2 3 4 5 6 7 8 9  
 $T = s e n e s c ? ? c$ 

⇒ can omit LMS of length 1 in the recursion

S\* S\* L S\* L S\*

S×

#### summary

- bijective BWT construction
  - O(n) time on integer alphabets
- methods
  - adapt SAIS
  - sort conjugates in  $\prec_{\omega}$  instead of suffixes in lex. order
  - skip LMS of length 1 in recursion

#### summary

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all questions are welcome!