

Maximal Exponent Repeats

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Stringologists' Mascot?

Stringocephalus [Wikipedia, 2011]



- ★ extinct genus; between 360 to 408 million years old
- ★ usually found as fossils in Devonian marine rocks
- ★ found in western North America, northern Europe (especially Poland), Asia and the Canning Basin of Western Australia

A beautiful mind!
[based on fake etymology]

Repeats

- ★ String = text = word = sequence of symbols
- ★ Repetition = periodic string = power of exponent ≥ 2

length = 17
←—————→
a b a a b a b a a b a b a a b a b
←————→
period = 5

$$\text{exponent} = \frac{\text{length}}{\text{period}} = \frac{17}{5} = 3.4$$

Repeats

- ★ String = text = word = sequence of symbols
- ★ Repetition = periodic string = power of exponent ≥ 2
abaab abaab abaab ab = (abaab)^{17/5}

Repeats

★ String = text = word = sequence of symbols

★ Repetition = periodic string = power of exponent ≥ 2

abaab abaab abaab ab = (abaab)^{17/5}
alfalfa = (alf)^{7/3} entente = (ent)^{7/3}

Repeats

★ String = text = word = sequence of symbols

★ Repetition = periodic string = power of exponent ≥ 2

$$\begin{aligned} \text{abaab abaab abaab ab} &= (\text{abaab})^{17/5} \\ \text{alfalfa} &= (\text{alf})^{7/3} & \text{entente} &= (\text{ent})^{7/3} \end{aligned}$$

★ Repeat: $1 < \text{exponent} \leq 2$

The diagram shows the string "abaabcccccabab" with two horizontal arrows above it. The top arrow spans the entire string and is labeled "length = 15". The bottom arrow spans the first 10 characters "abaabccccc" and is labeled "period = 10". The last 5 characters "abab" are labeled "border".

$$\text{exponent} = \frac{\text{length}}{\text{period}} = 1 + \frac{\text{border}}{\text{period}} = \frac{15}{10} = 1.5$$

Repeats

★ String = text = word = sequence of symbols

★ Repetition = periodic string = power of exponent ≥ 2

$$\begin{array}{l} \text{abaab abaab abaab ab} = (\text{abaab})^{17/5} \\ \text{alfalfa} = (\text{alf})^{7/3} \qquad \text{entente} = (\text{ent})^{7/3} \end{array}$$

★ Repeat: $1 < \text{exponent} \leq 2$

$$\text{abaab ccccc abaab} = (\text{abaabccccc})^{15/10}$$

Repeats

★ String = text = word = sequence of symbols

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$$\begin{aligned} \text{abaab abaab abaab ab} &= (\text{abaab})^{17/5} \\ \text{alfalfa} &= (\text{alf})^{7/3} & \text{entente} &= (\text{ent})^{7/3} \end{aligned}$$

★ Repeat: $1 < \text{exponent} \leq 2$

$$\begin{aligned} \text{abaab ccccc abaab} &= (\text{abaabccccc})^{15/10} \\ \text{restore} &= (\text{resto})^{7/5} & \text{all in all} &= (\text{all in })^{10/7} \end{aligned}$$

Motivation

- ★ **Combinatorics on words**

Avoidability of repetitions, Interaction between periods, Counting repetitions

- ★ **Pattern matching algorithms**

String Matching, Time-space optimal String Matching: local and global periods, Indexing

- ★ **Text Compression**

Generalised run-length encoding
Dictionary-based compression

- ★ **Analysis of biological molecular sequences**

Intensive study of satellites, Simple Sequence Repeats, or Tandem Repeats in DNA sequences
Molecular structure prediction

- ★ **Analysis of music**

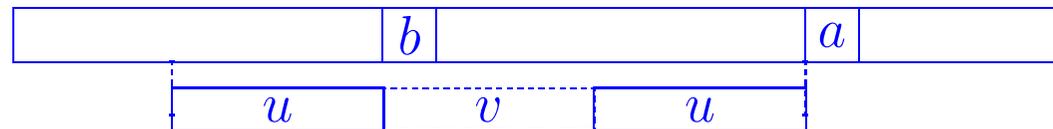
Rhythm detection, Chorus location

Maximal Exponent

- ★ String y of length n drawn from a fixed alphabet
maximal exponent of all factors of y ?
- ★ RUN: maximal periodicity in y (exponent ≥ 2)
- ★ Linear number of runs, linear-time computation on fixed
alphabet [Kolpakov, Kucherov, 1999]
- ★ Question 1: Compute the maximal exponent of all repeats
in an overlap-free string

Maximal-Exponent Repeats

- ★ MER: maximal exponent repeat occurring in y
a MER occurrence is maximal



abacada axayaza

$\Omega(n^2)$ maximal repeats but $\lfloor \frac{n}{2} \rfloor$ MER occ. of exponent $\frac{3}{2}$

- ★ **Question 2: locate all MER occurrences in an overlap-free string**

Theorem 1 ([Badkobeh, C., Toopsuwan, 2012]) *All the occurrences of maximal-exponent repeats in an overlap-free string over a fixed alphabet can be listed in linear time.*

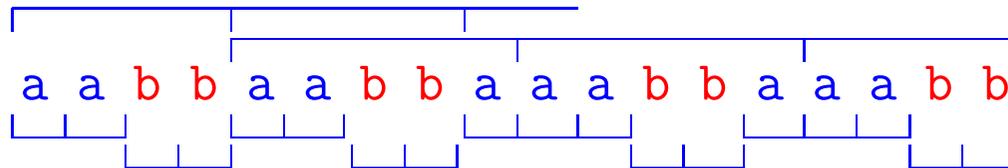
All powers

- ★ Finding all occurrences of powers efficiently
 - Problem: too many occurrences
 - Solution: select some, encode them in a compact form
- ★ All primitively-rooted right-maximal integer exponent: $O(n \log n)$ time [C., 1981]
- ★ All primitively-rooted right-maximal: $O(n \log n)$ time [Apostolico, Preparata, 1983]
- ★ All primitively-rooted maximal: $O(n \log n)$ time [Main, Lorentz, 1985]
- ★ All leftmost maximal: $O(n \log a)$ time [Main, 1989] extension of [C., 1983]
- ★ All runs in Fibonacci strings: $O(n)$ time [Iliopoulos, Moore, Smyth, 1997]

Computing runs

- ★ Run: maximal periodicity

Runs encode all powers



- ★ Computation in $O(n \log a)$ time

[Kolpakov, Kucherov, 1999]

- ★ .. based on

- modified Main's algorithm
- f-factorization (kind of Ziv-Lempel factorization)
- linear upper bound on the number of runs

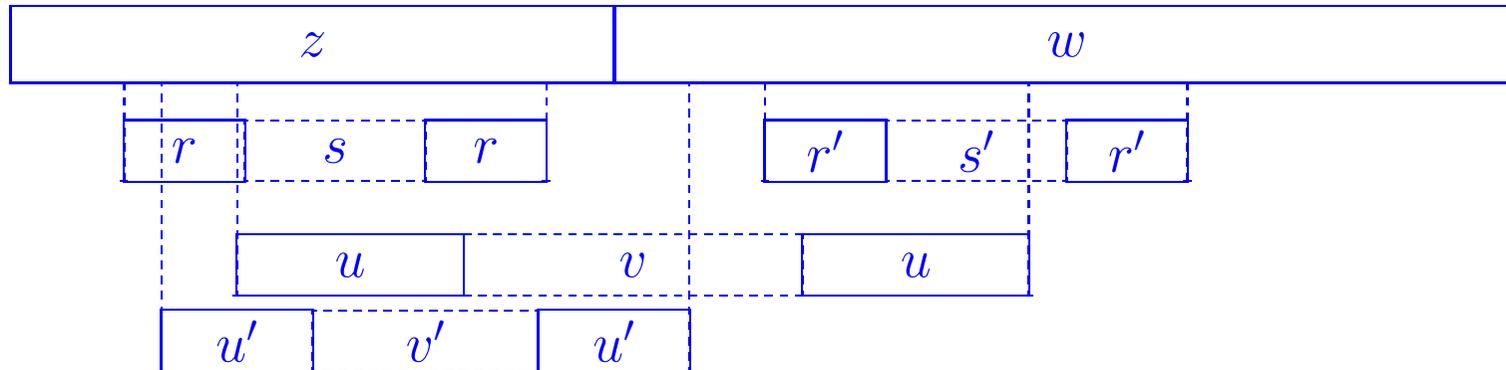
- ★ Explicit best known bound:

$$\text{runs}(n) \leq 1.029n \text{ [C., Ilie, Tinta, 2008]}$$

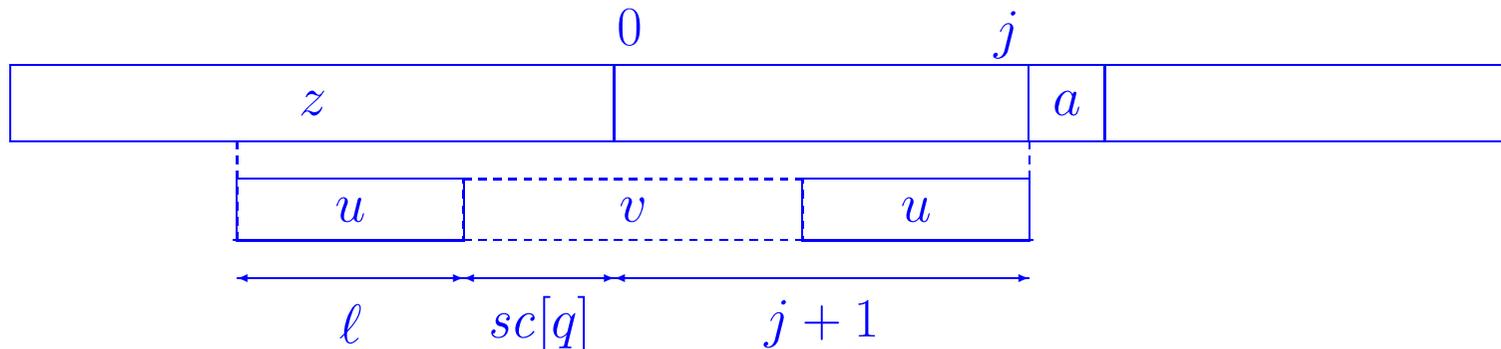
$$\text{runs}(n) \geq 0.944n \text{ [Simpson, 2009]}$$

Computing the maximal exponent

- ★ Naive algorithm
border/period/exponent in linear time (Morris-Pratt algo)
yields $O(n^3)$ time solution, reducible to $O(n^2)$
- ★ Divide and conquer

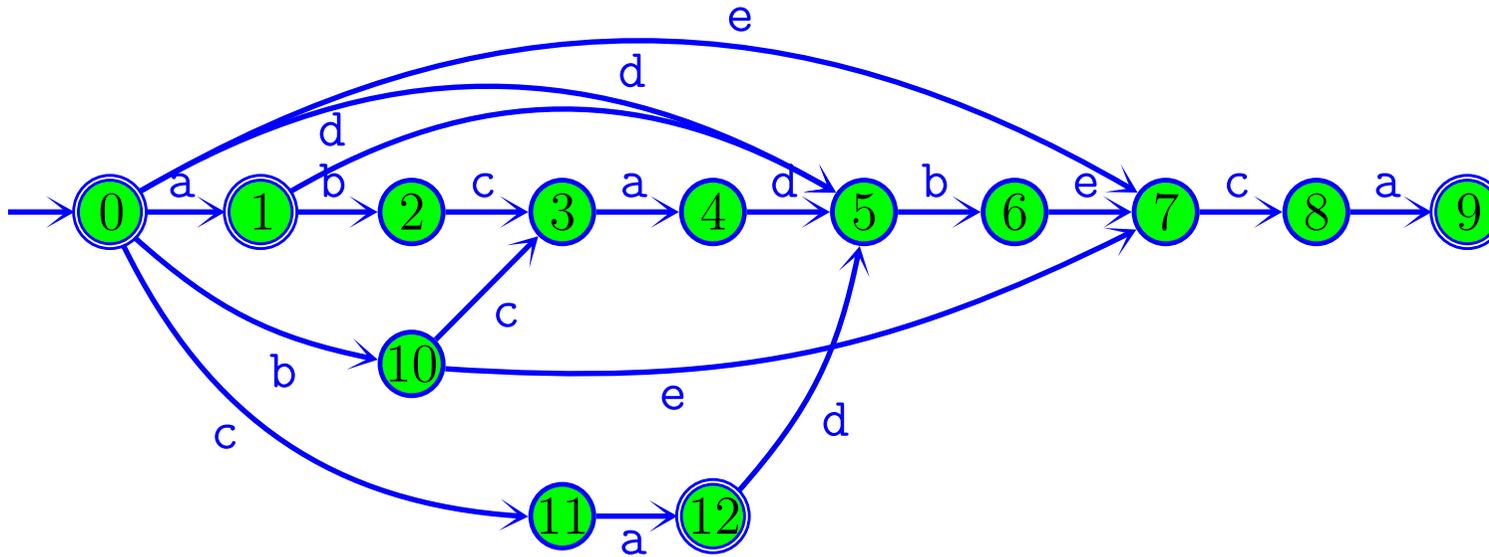


Repeat in a product



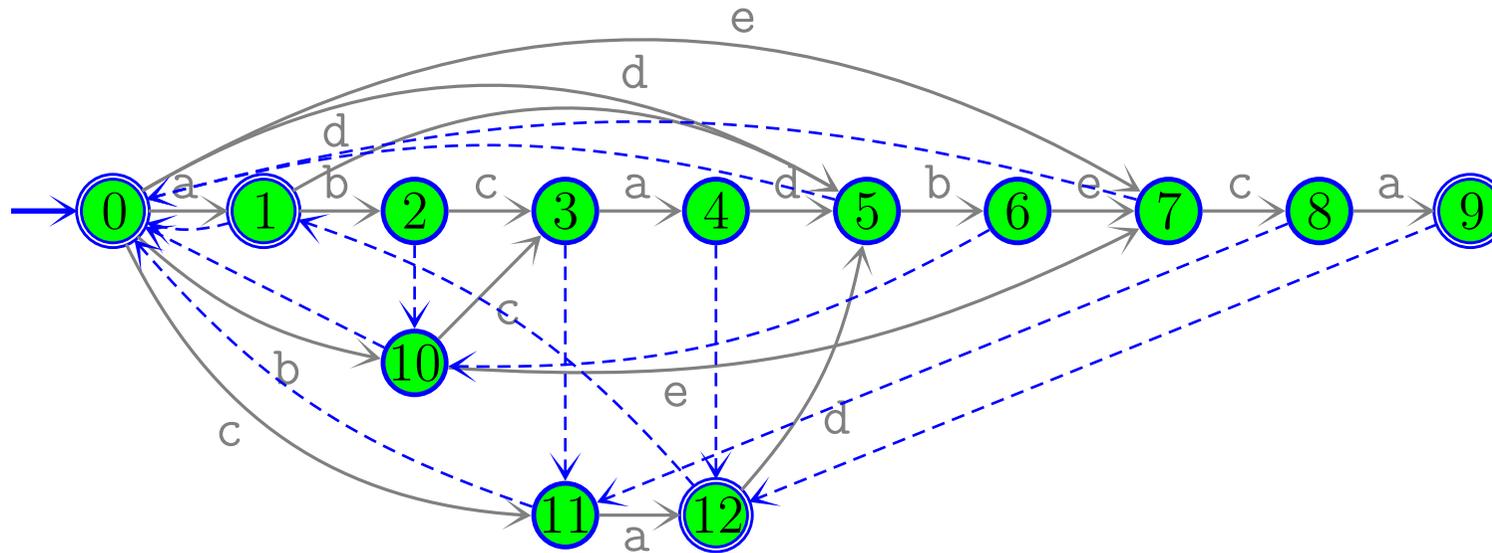
- ★ With the Suffix Automaton of z :
 - u longest factor of z ending at j ; $l = |u|$
 - state $q = \delta(\text{initial}, u)$
 $sc[q]$ locates the last occurrence of u in z
 - exponent $= \frac{l + sc[q] + j + 1}{sc[q] + j + 1}$
- ★ failure links on states to locate suffixes of u

Suffix Automaton



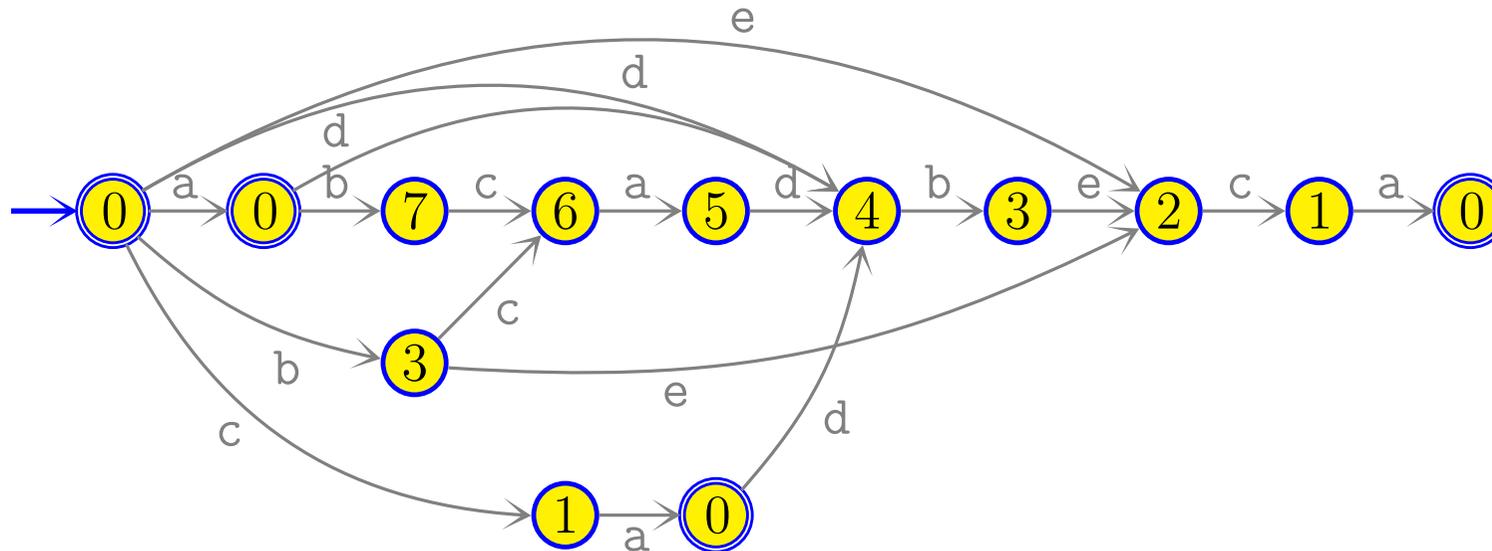
★ Used to locate rightmost occurrences of border u in z

Suffix Automaton



- ★ Used to locate rightmost occurrences of border u in z
- ★ Equipped with: Failure links

Suffix Automaton



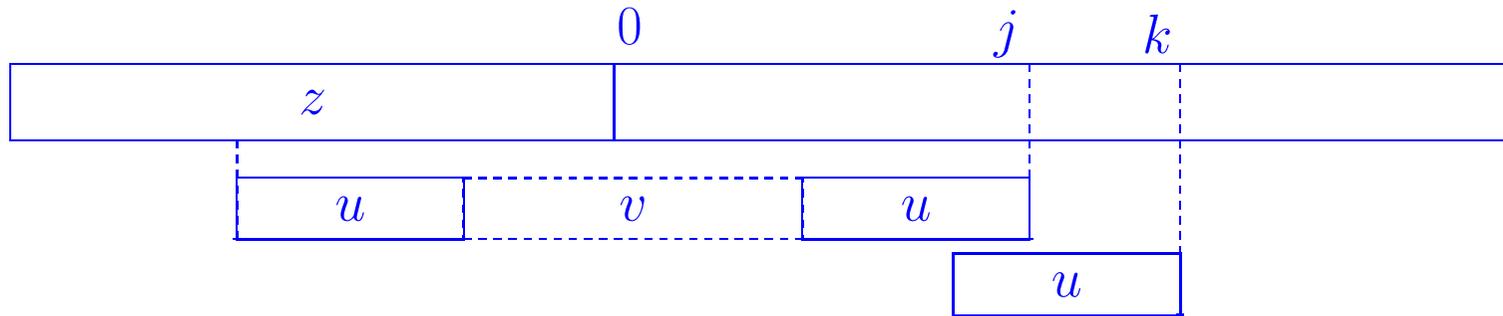
- ★ Used to locate rightmost occurrences of border u in z
- ★ Equipped with:
Failure links
 $L[q]$ = maximal length of words reaching state q
 $sc[q]$ = shortest length to a terminal state

Core algorithm

MaxExp(z, w, e)

```
1   $\mathcal{S} \leftarrow$  Suffix Automaton of  $z$ 
2  mark initial( $\mathcal{S}$ )
3   $(q, \ell) \leftarrow (F[\text{last}(\mathcal{S})], L[F[\text{last}(\mathcal{S})]])$ 
4  for  $j \leftarrow 0$  to  $\min\{\lfloor |z|/(e-1) - 1 \rfloor, |w| - 1\}$  do
5      while goto( $q, w[j]$ ) = NIL and  $q \neq$  initial( $\mathcal{S}$ ) do
6           $(q, \ell) \leftarrow (F[q], L[F[q]])$ 
7      if goto( $q, w[j]$ )  $\neq$  NIL then
8           $(q, \ell) \leftarrow (\text{goto}(q, w[j]), \ell + 1)$ 
9           $(q', \ell') \leftarrow (q, \ell)$ 
10         while  $q'$  unmarked do
11              $e \leftarrow \max\{e, (\ell' + sc[q'] + j + 1)/(sc[q'] + j + 1)\}$ 
12             if  $\ell' = L[q']$  then
13                 mark  $q'$ 
14                  $(q', \ell') \leftarrow (F[q'], L[F[q']])$ 
15  return  $e$ 
```

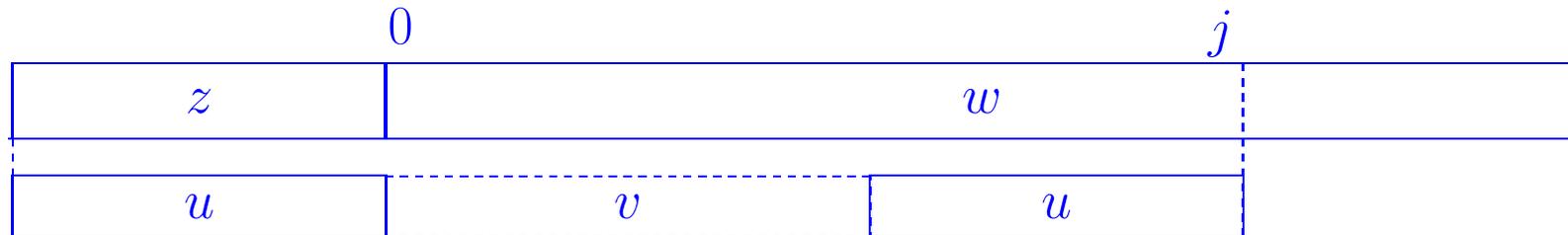
Marking states



- ★ At j , state q is marked if u longest with $q = \delta(\text{initial}, u)$
- ★ then no more exponent computation if q met later
- ★ it happens when a failure link is used
then no more than $2|z|$ extra exponent computations

Runtime

- ★ Linear number of exponent computations due to marking



- ★ j needs not be larger than $|z|/(e-1) - 1$ (e current exponent)
- ★ for long enough y , $e \geq \mathbf{RT}(a)$ then

$$j \leq \frac{|z|}{\mathbf{RT}(a) - 1} - 1$$

- ★ $O(|z|)$ time to compute exponents $\geq \mathbf{RT}(a)$ in zw
independent of $|w|$

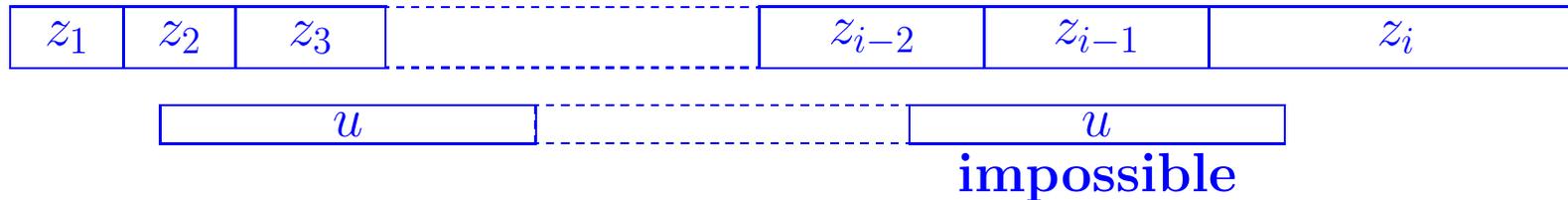
Maximal exponent

- ★ **Balanced divide and conquer:** $O(n \log n)$
- ★ **Use of the f-factorisation:** $O(n)$
- ★ **Phrase = longest factor occurring before (no overlap)**
- ★ **Example of $y = \text{abaabababaaababb}$**

a b a a b a a a b a a a b a a b

- ★ **Computation with the suffix tree of y :** $O(n \log a)$ time
[Storer, Szymanski, 1982]
- ★ **.. however possible in linear time with the suffix array of y**
[C., Tischler, 2010], extension of [C., Ilie, 2008]

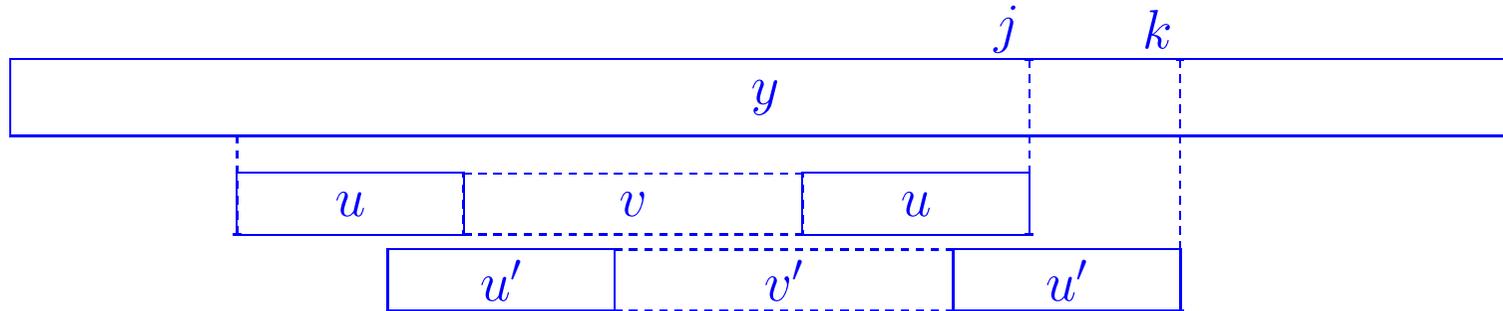
Maximal exponent



- ★ No phrase in the second occurrence of u
- ★ for each i
 - $\text{MAXEXP}(z_{i-1}, z_i)$
 - $\text{MAXEXP}(\widetilde{z}_i, \widetilde{z}_{i-1})$
 - $\text{MAXEXP}(z_{i-1}\widetilde{z}_i, z_1 \cdots \widetilde{z}_{i-2})$
- ★ Running time: $O(\sum z_i) = O(n)$

Theorem 2 ([**Badkobeh, C., Toopsuwan**]) *The maximal exponent of repeats can be computed in linear time on a fixed alphabet.*

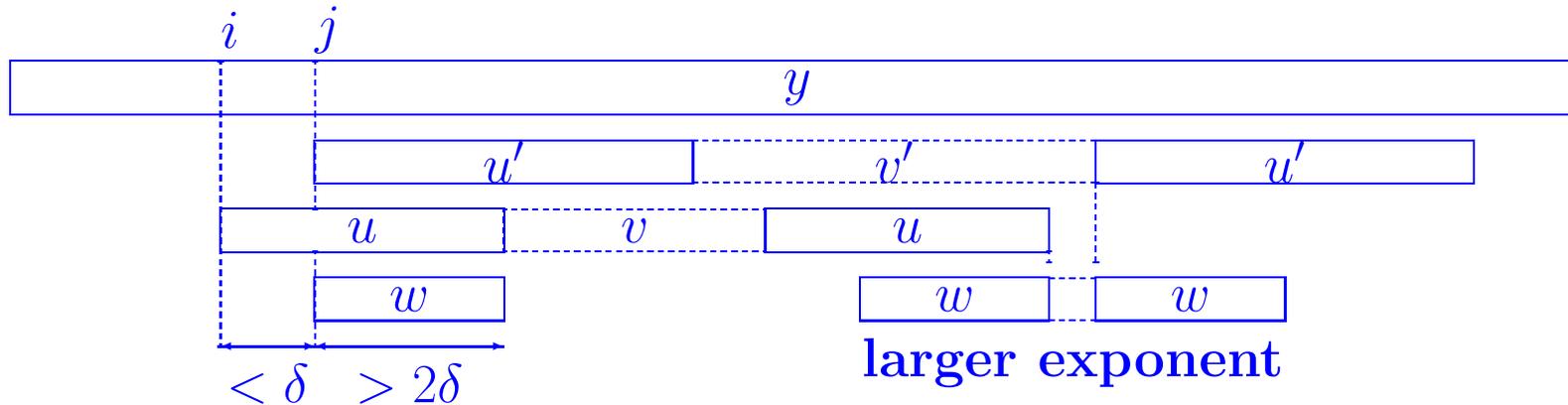
Counting MER occurrences (1)



- ★ Impossible when uvu and $u'v'u'$ have the same border length:
then $k - j > |u|$
- ★ no more than $n/(b+1)$ MER occurrences of border length b
- ★ total number of occurrences:

$$\leq \sum_{b=1}^N \frac{n}{b+1}$$

Counting MER occurrences (2)



- ★ δ -MER: MER whose border length satisfies $3\delta \leq b < 4\delta$.
- ★ two δ -MER occurrences at i and j , then $j - i \geq \delta$
- ★ total number of occurrences:

$$\leq \sum_{\delta \in \Delta} \frac{n}{\delta} = n \left(3 + \frac{3}{2} + 1 + \frac{3}{4} + \left(\frac{3}{4}\right)^2 + \dots \right) < 8.5n.$$

Counting MER occurrences (3)

★ Combining

★ for border lengths up to 11

$$\leq \sum_{b=1}^{11} \frac{n}{b+1} = 2.103211 n$$

★ for border length from 12, $\Gamma = \{4, 4(4/3), 4(4/3)^2, \dots\}$,

$$\leq \sum_{\delta \in \Gamma} \frac{n}{\delta} = \frac{1}{4} \left(1 + \frac{3}{4} + \left(\frac{3}{4}\right)^2 + \dots \right) n = n$$

Theorem 3 *There are less than $3.11n$ occurrences of MERs in a string of length n .*

★ Consequence: linear computation of all MER occurrences with upgraded algorithm

Conclusion and questions

- ★ Linear computation of MER occurrences and of runs on a fixed alphabet
- ★ MER computation in the comparison model?
Note: optimal $O(n \log n)$ time algorithm for runs
[C., Rytter, Tyczyński, 2012]
- ★ Exact bound on the maximal number of MER occurrences?
less than n ? tested up to length 20 on alphabet sizes 2, 3 and 4

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less than n ? tested up to length 20 on alphabet sizes 2, 3 and 4
- ★ 2 is a threshold exponent:
above, at most a linear number of runs
below, possible quadratic number of maximal occurrences of repeats, but at most a linear number of MER occurrences
- ★ Any other threshold?
Note: no more than $\frac{1}{\epsilon} n \ln n$ maximal repetitions of exponent more than $1 + \epsilon$ [Kolpakov, Kucherov, Ochem, 2010]