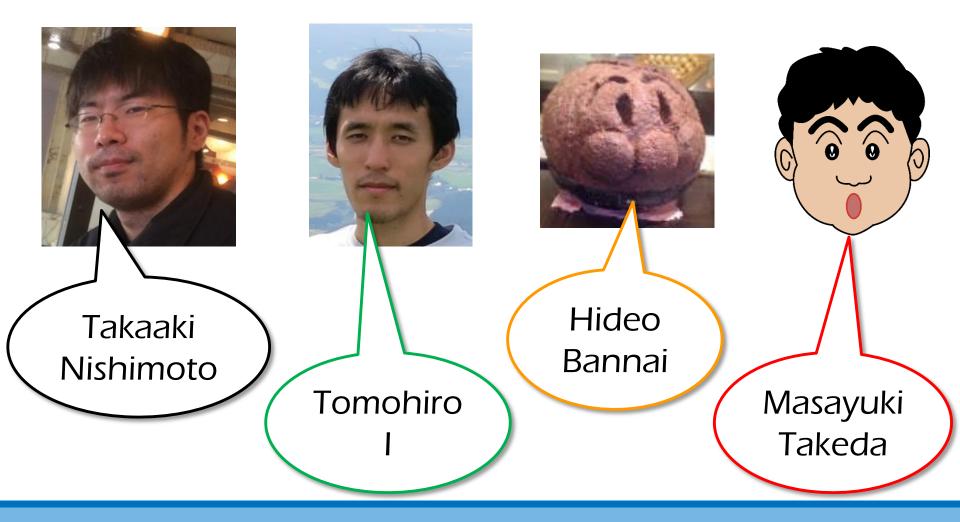


# Faster Longest Common Extension on Compressed Strings and Applications

Shunsuke Inenaga Kyushu University, Japan



This work is a collaboration with:

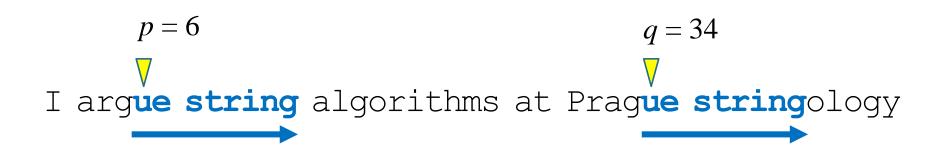


**Longest common extension** (LCE) on string T is a task such that, given two positions p and q, compute the length of the longest common substring of T starting at positions p and q.

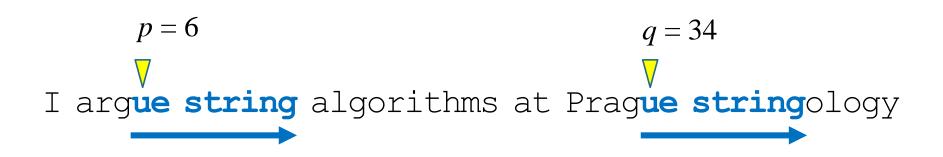
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p = 6  $\bigtriangledown$ I argue string algorithms at Prague stringology

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LCE(6, 34) = 9

## **Background & Motivation**

- ✓ LCE has numerous applications, e.g., approximate pattern matching, computing palindromes, computing approximate repeats.
- ✓ A string *T* of length *u* can be preprocessed in O(u) time and space so that each LCE query can be answered in O(1) time [Demaine et al.].
- ✓ However, the O(u) complexity can be prohibitive for large-scaled text.
- ✓ To save preprocessing time and space, we consider LCE on grammar-compressed text.

# Straight Line Program (SLP)

#### Definition

An SLP is a sequence of *n* productions  $X_1 \rightarrow expr_1, X_2 \rightarrow expr_2, \dots, X_n \rightarrow expr_n$ •  $expr_i = a$   $(a \in \Sigma)$ 

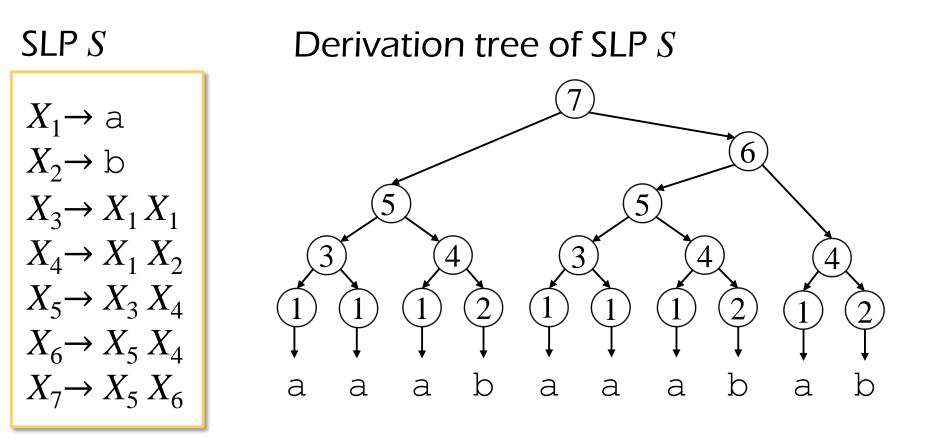
• 
$$expr_i = X_l X_r$$
  $(l, r < i)$ 

- ✓ An SLP is a CFG in the Chomsky normal form which derives a single string.
- ✓ SLPs model outputs of grammar-based compression algorithms (e.g., Re-pair, LZ78, LZDF, OLCA, etc).

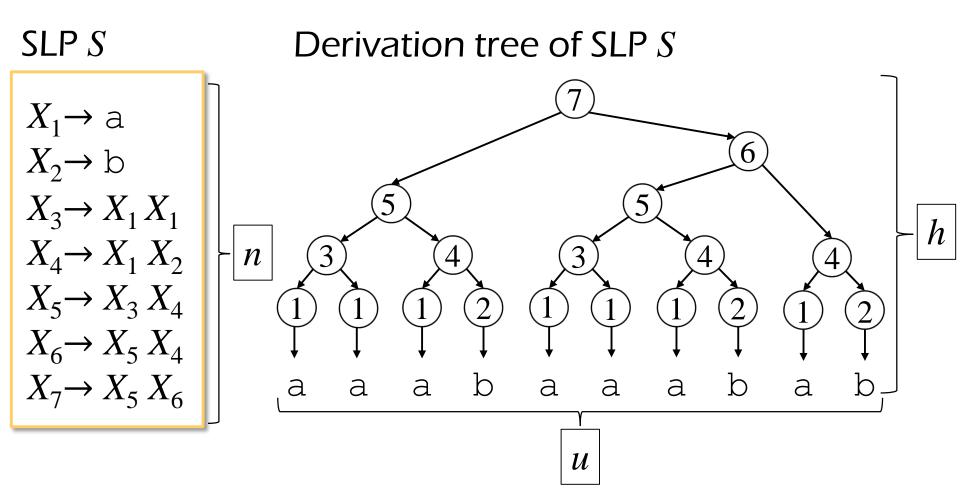
# Straight Line Program (SLP)

*n* : size (# of productions) of a given SLP S *h* : height of the derivation tree of S *u* : length of the uncompressed string T
represented by SLP S

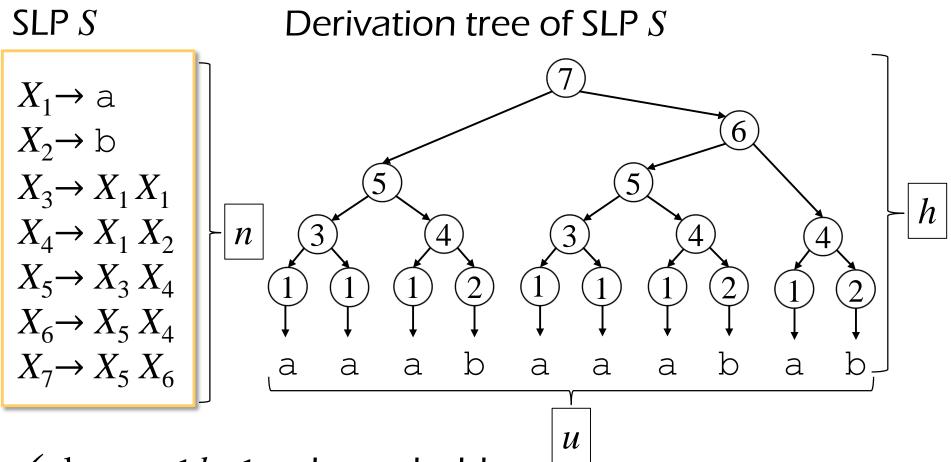
### **Example of SLP**



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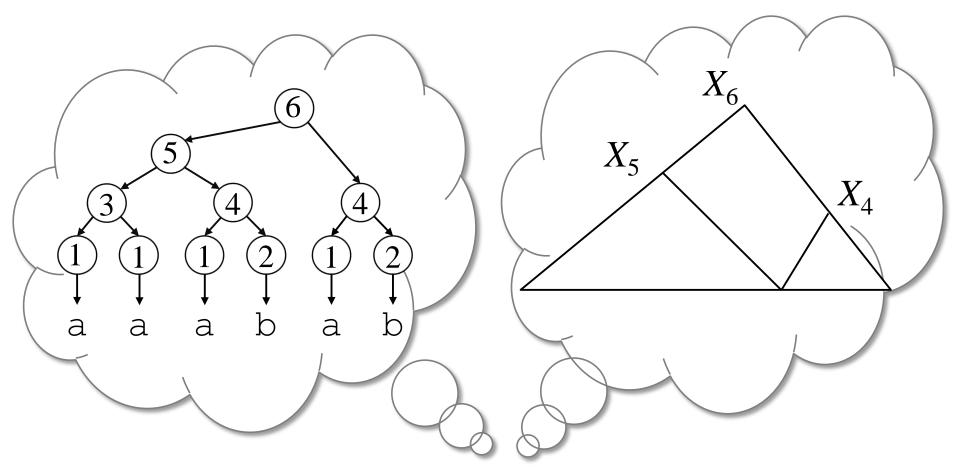
### **Example of SLP**



✓  $\log_2 u \le h \le n$  always holds.

✓ u can be exponential in n (e.g. consider string a<sup>u</sup>).
 ➢ Hence, O(poly(n)) solutions are of significance.

### Important Remarks

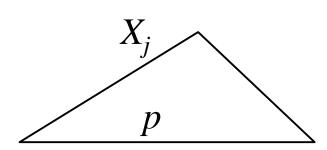


 Derivation trees are only imaginary (used only for explanations) and are <u>never constructed explicitly</u>.

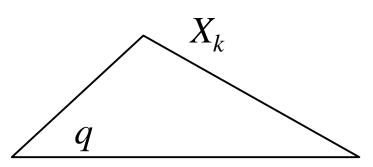
### Longest Common Extension on SLP

Problem 1 (grammar compressed LCE)

Preprocess an input SLP  $S = \{X_i \rightarrow expr_i\}_{i=1}^n$ so that subsequent longest common extension queries  $\mathbf{LCE}(X_j, X_k, p, q)$  can be answered quickly.



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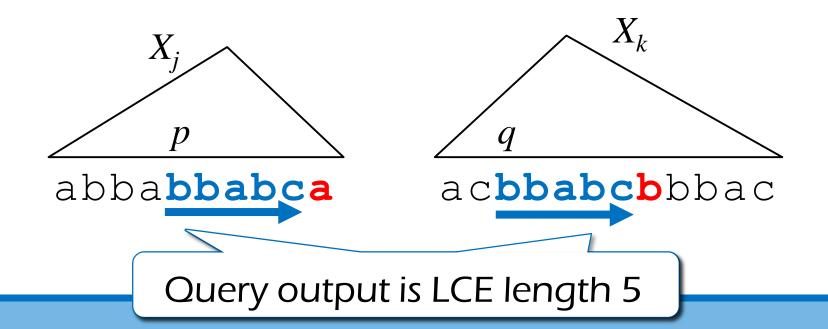


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## What is the difficulty?

- ✓ We are not allowed to expand the SLP (compressed text), since this takes O(2<sup>n</sup>) time in the worst case.
- But we want to know the length of the longest common extension!

# LCE algorithms on SLPs

Algorithms	Query time	Preprocessing time	Space
Folklore	O(hL)	O(n)	O(n)
(extended) Miyazaki et al. '97	$O(hn^2)$	$O(n^4)$	$O(n^2)$
(extended) Lifshits '07	$O(hn^2)$	$O(hn^2)$	$O(n^2)$
l et al. '15	$O(h \log u)$	$O(hn^2)$	$O(n^2)$
Bille et al. ′15 (randomized)	$O(\log u + \log^2 L)$	N/A	<i>O</i> ( <i>n</i> )

n: size of SLP

- *u*: length of uncompressed string *T*
- h: height of SLP derivation tree
- L: LCE length (output)
- *z*: size of LZ77 factorization of *T*

- $\log u \le h \le n$
- L = O(u)
- $\log^* u = o(\log u)$
- $z \le n$  (due to Rytter '03)

# LCE algorithms on SLPs

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This work	$O(\log u + \log^* u \log L)$	$O(n \log \log n \log^* u \log u)$	$O(n+z\log^* u \log u)$

n: size of SLP

*u*: length of uncompressed string *T* 

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- $\log u \le h \le n$
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# Logstar (iterated logarithm)

#### Definition

The **logstar** of a positive integer u, denoted  $\log^* u$ , is the number of times the logarithm function needs to be iteratively applied to u until the result becomes less than or equal to 1.

✓ The logstar is a <u>very slowly growing function</u>, e.g.,  $\log^* 2^{65536} = 5$ .

# LCE algorithms on SLPs

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<i>n</i> : size of SLP <b>Fastest</b> deterministic z: Deterministic z: Deterministic				

# Our strategy

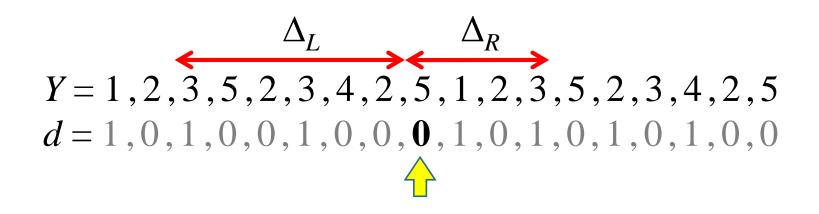
- ✓ All previous algorithms work on the SLP derivation trees of two query non-terminals.
- ✓ Our new algorithm does <u>NOT</u> work on the SLP derivation trees.
- ✓ Instead, we construct a different tree of logarithmic height, based on
  - Iocally consistent parsing
  - signature encoding.

Lemma 1 [Mehlhorn et al., Alstrup et al.]

For any integer string  $Y \in \{1..m\}^*$  in which no adjacent elements are equal (i.e.  $Y[i] \neq Y[i+1]$ ), there is a bit string d of length |Y| such that

- 1. no 1's appear consecutively;
- 2. at most three 0's appear consecutively;
- 3. each d[i] is determined locally, i.e., by  $Y[i-\Delta_L...i-1]$  and  $Y[i...i+\Delta_R]$ , where  $\Delta_L \leq \log^* m + 6$  and  $\Delta_R \leq 4$ ;
- 4. *d* can be computed in O(|Y|) time.

#### Y = 1, 2, 3, 5, 2, 3, 4, 2, 5, 1, 2, 3, 5, 2, 3, 4, 2, 5d = 1, 0, 1, 0, 0, 1, 0, 0, 0, 1, 0, 1, 0, 1, 0, 1, 0, 0



 $\Delta_L \le \log^* m + 6$  $\Delta_R \le 4$ 

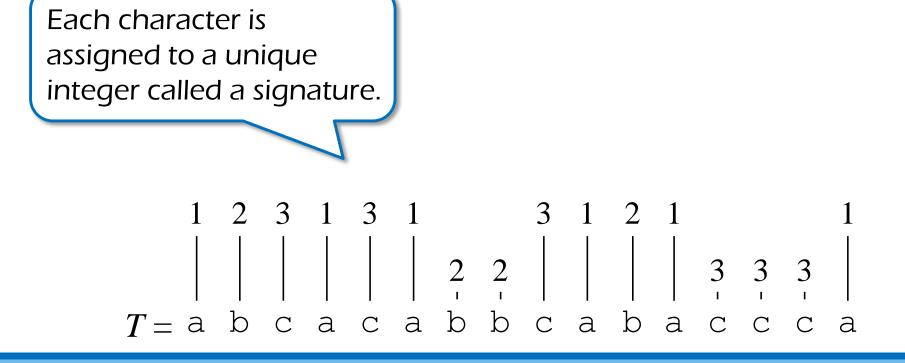
#### Y = [1, 2, 3, 5, 2, 3, 4, 2, 5, 1, 2, 3, 5, 2, 3, 4, 2, 5]d = 1, 0, 1, 0, 0, 1, 0, 0, 0, 1, 0, 1, 0, 1, 0, 1, 0, 0

✓ Using the bit string *d*, any integer string *Y* can be uniquely decomposed in linear time into blocks of length 2-4.

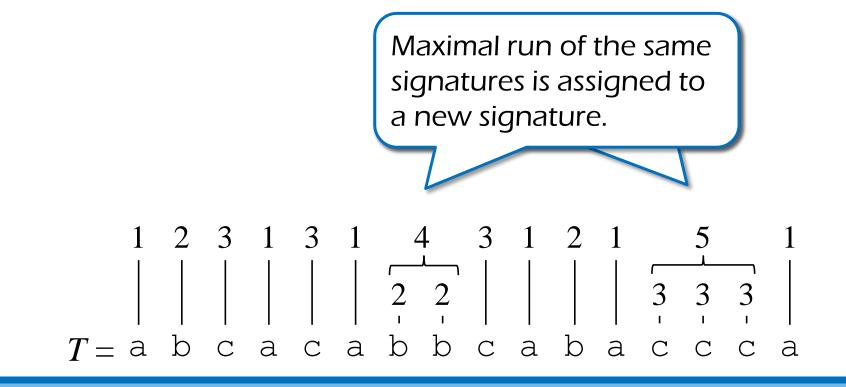
✓ Iteratively apply locally consistent parsing to input string T until a single integer is obtained.

#### T = a b c a c a b b c a b a c c c a

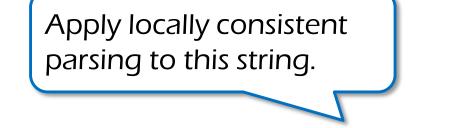
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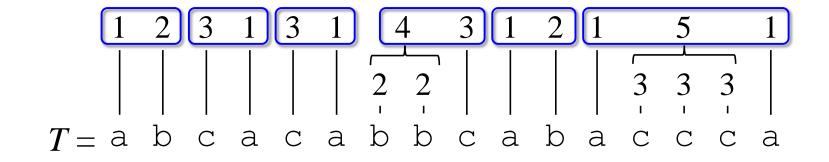


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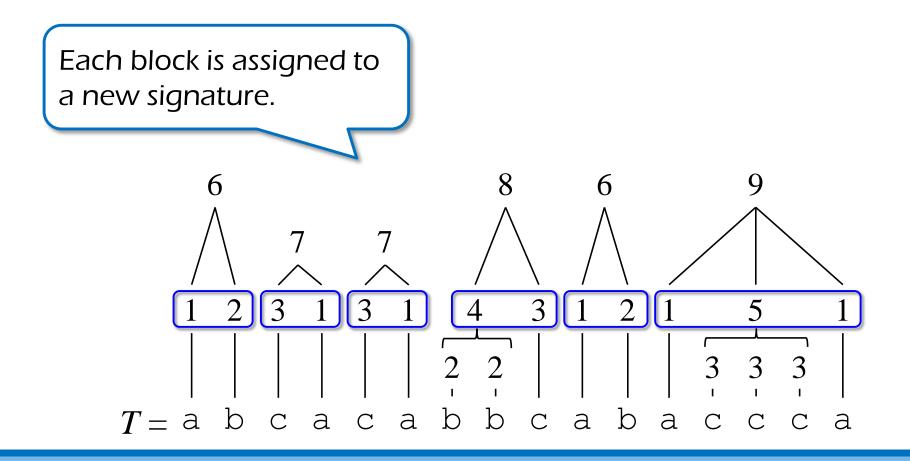


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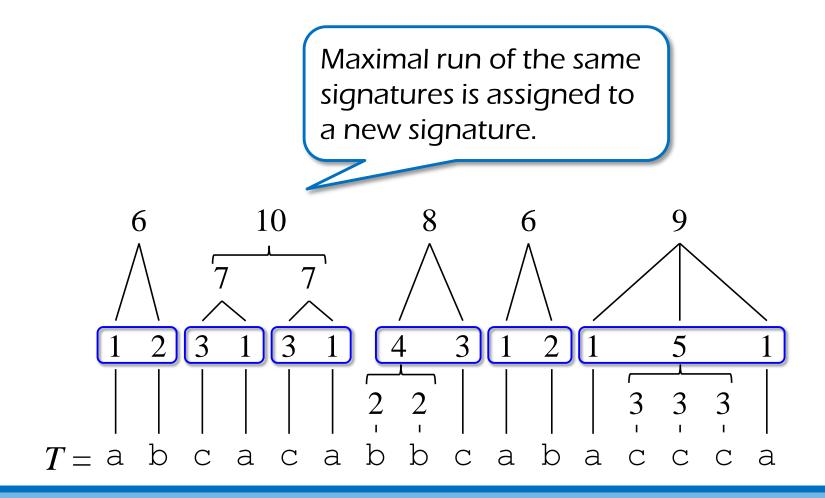




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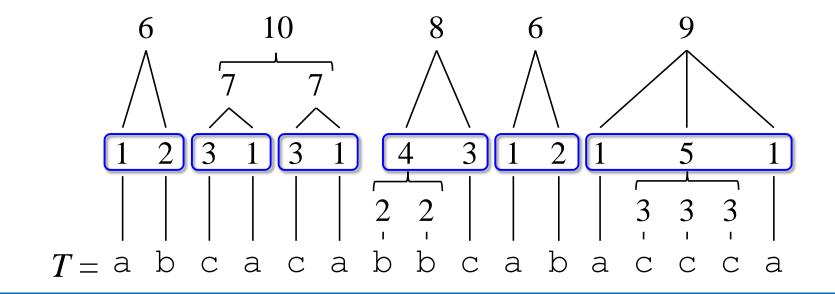


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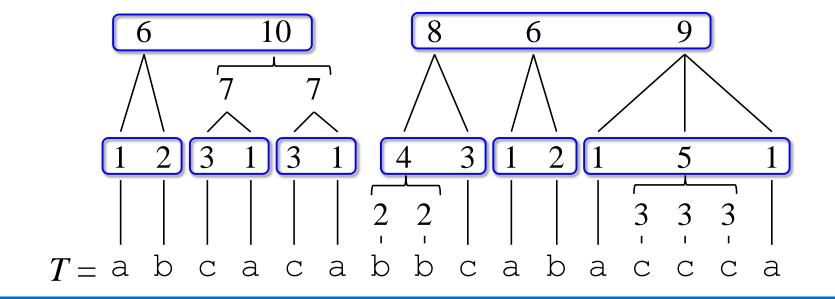


 Iteratively apply locally consistent parsing to input string T until a single integer is obtained.

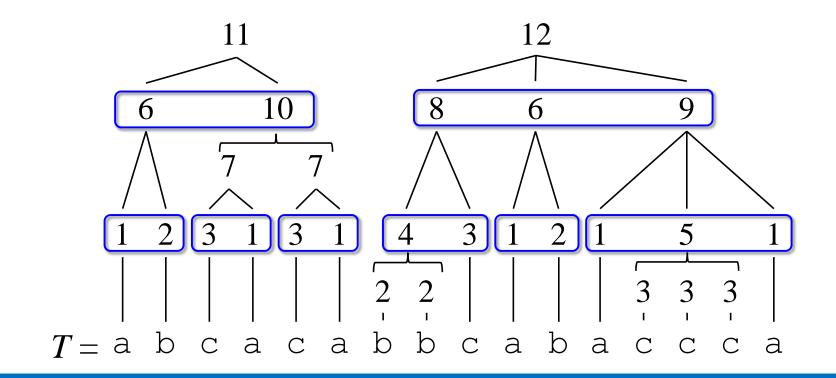
Apply locally consistent parsing to this string.



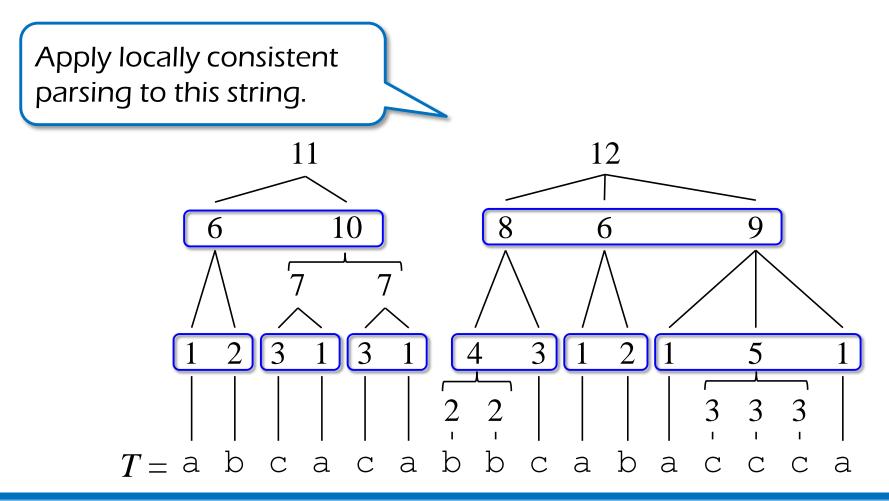
✓ Iteratively apply locally consistent parsing to input string T until a single integer is obtained.



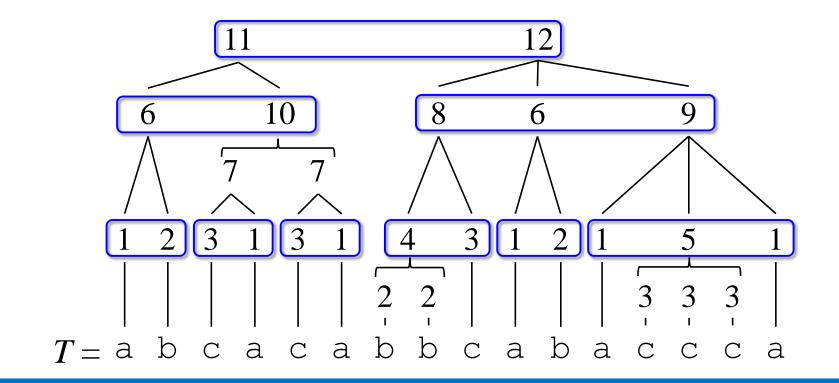
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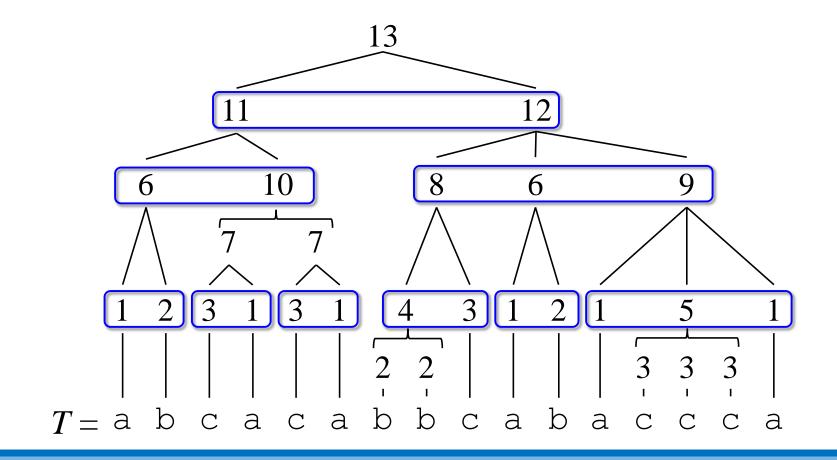


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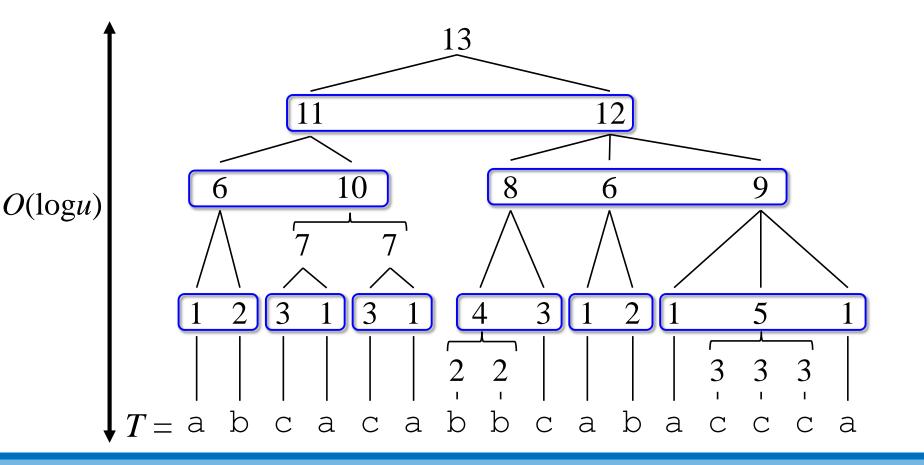
#### Signature encoding [Mehlhorn et al. '97]

 ✓ Iteratively apply locally consistent parsing to input string *T* until a single integer is obtained.



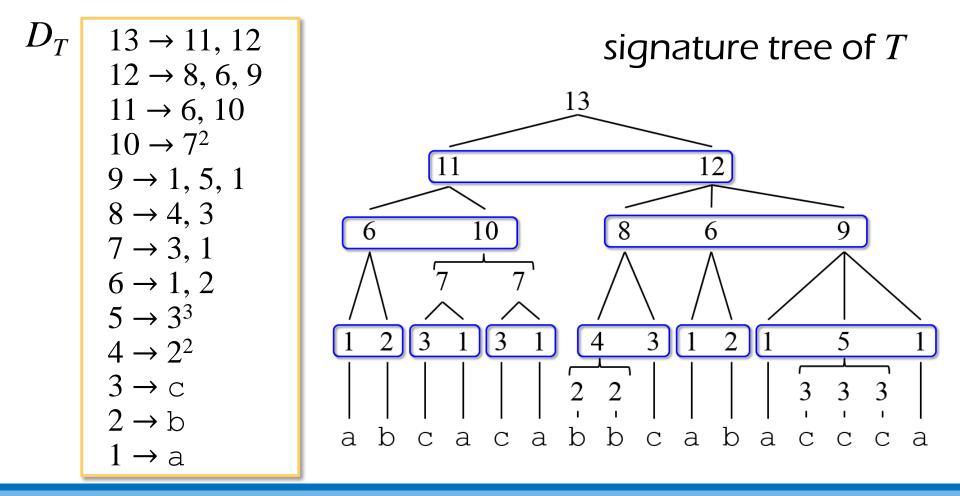
#### Signature encoding [Mehlhorn et al. '97]

✓ The height of this tree, called the signature tree, is  $O(\log u)$ , where u = |T|.



#### Signature encoding [Mehlhorn et al. '97]

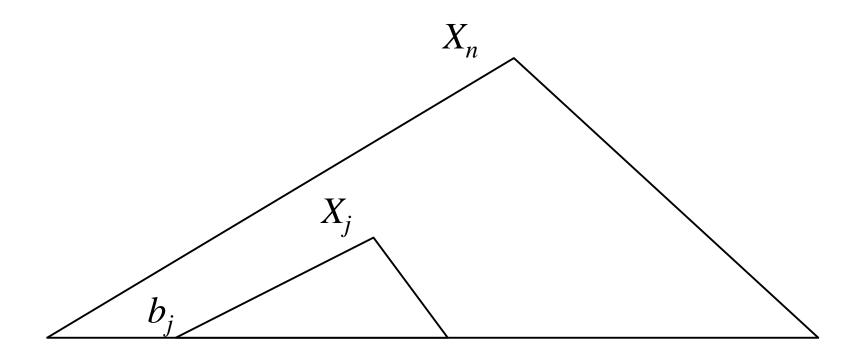
✓ The dictionary  $D_T$  of signatures is the **signature encoding** of input string *T*.



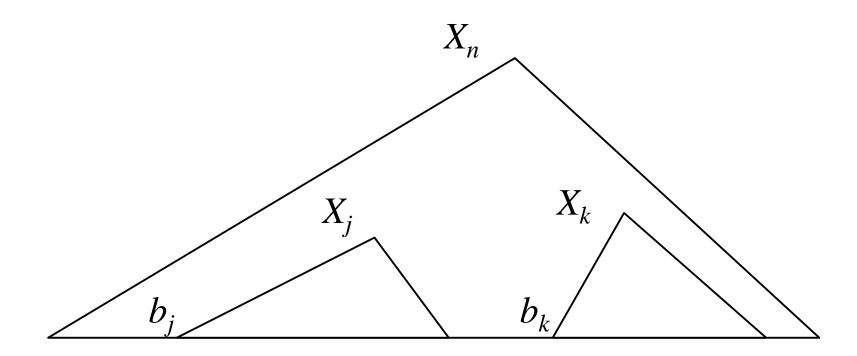
Lemma 2 (Faster LCE on SLP)

Given the signature encoding  $D_T$  of string Tof length u, we can compute  $\mathbf{LCE}(X_j, X_k, p, q)$ for any variables  $X_j$ ,  $X_k$  and positions p, q in  $O(\log u + \log^* u \log L)$  time, where L is the answer to the query (LCE length).

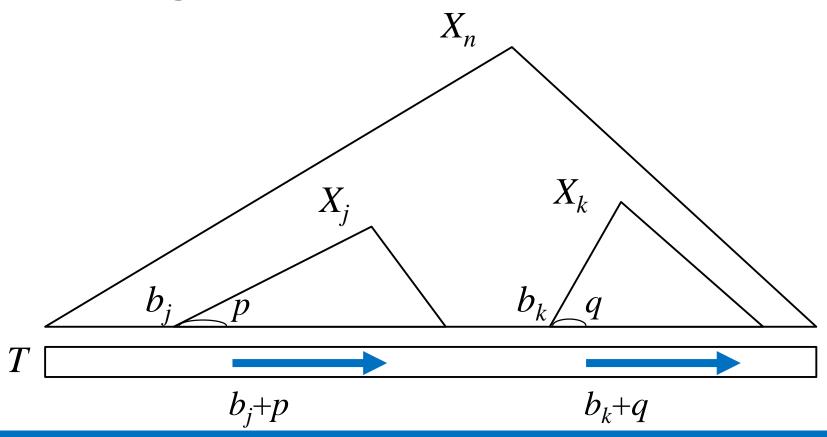
1. For every non-terminal  $X_j$ , we precompute and store its occurrence  $b_j$  in the derivation tree of  $X_n$ .



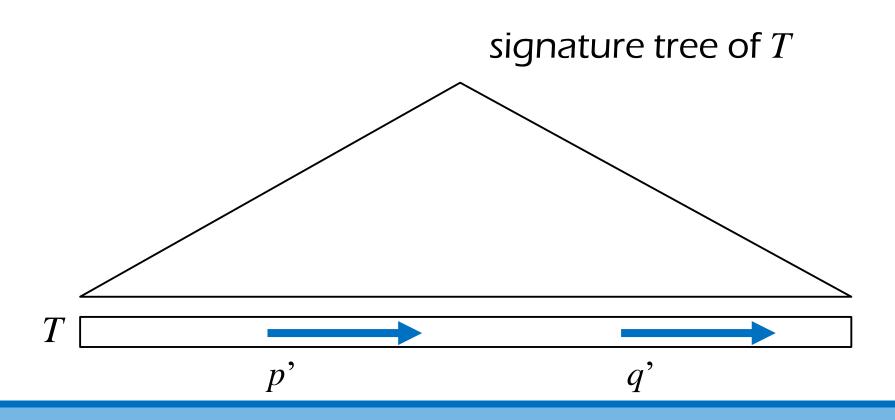
2. Given query variables  $X_j$  and  $X_k$  for LCE, we retrieve  $b_j$  and  $b_k$ .



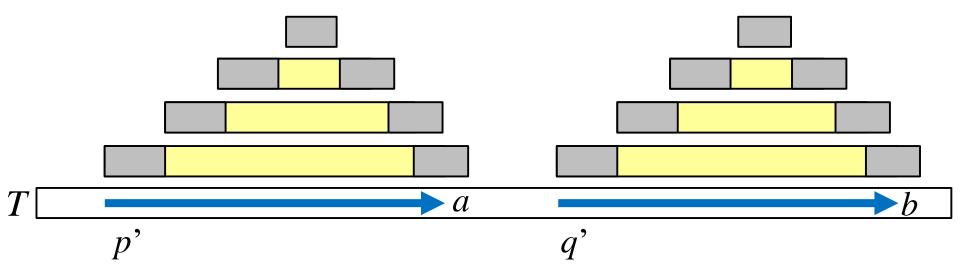
3. Since the last variable  $X_n$  derives string T,  $LCE(X_j, X_k, p, q)$  reduces to  $LCE(b_j+p, b_k+q)$ on string T.



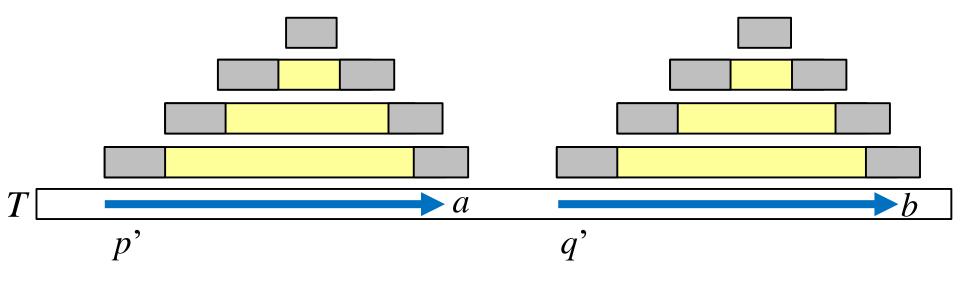
4. We turn attention to the <u>signature tree</u> of *T*, and compute LCE(p', q') there, where  $p' = b_j + p$  and  $q' = b_k + q$ .

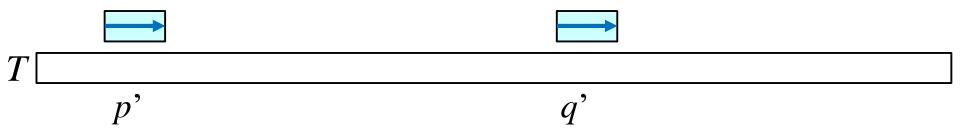


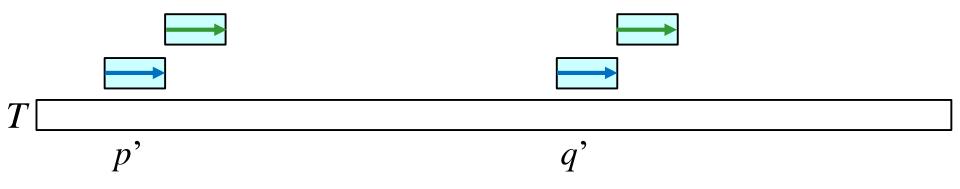
 By the property of signature encoding, at each level of the signature tree, there must be a <u>common sequence</u> of signatures for LCE(p', q') (yellow parts).

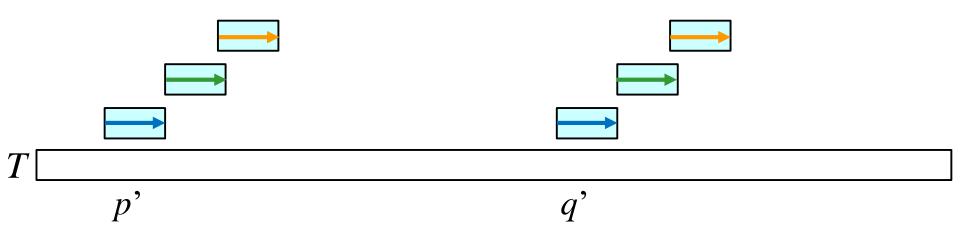


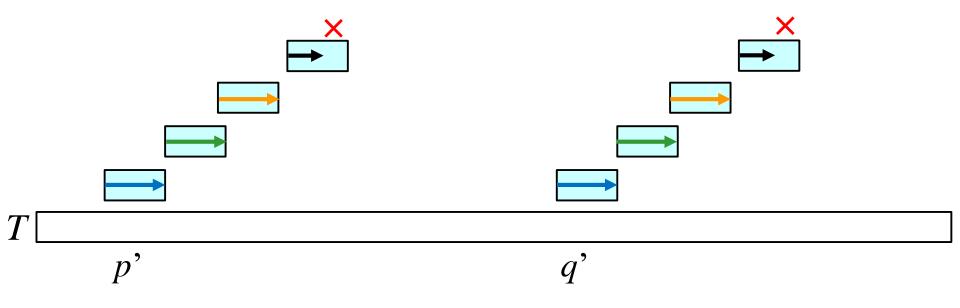
5. [Cont.] The left boundaries of length  $\Delta_L + O(1)$ may or may not be equal depending on the left contexts at each level, while the right boundaries of length  $\Delta_R + O(1)$  always have a mismatch.



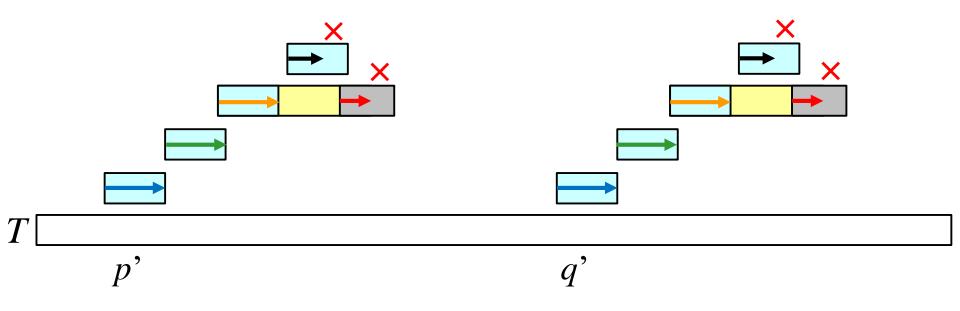




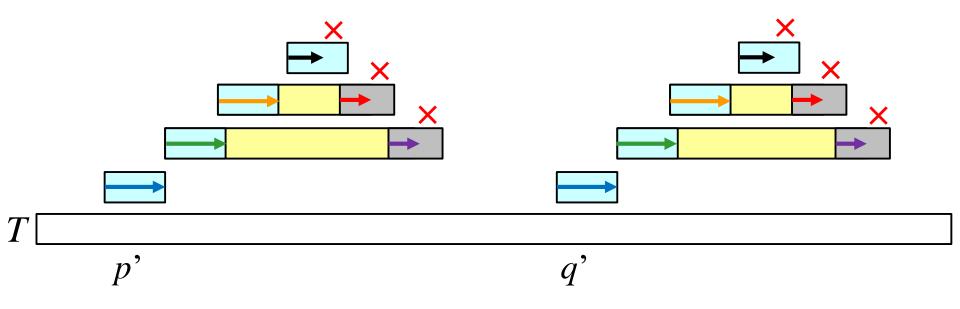




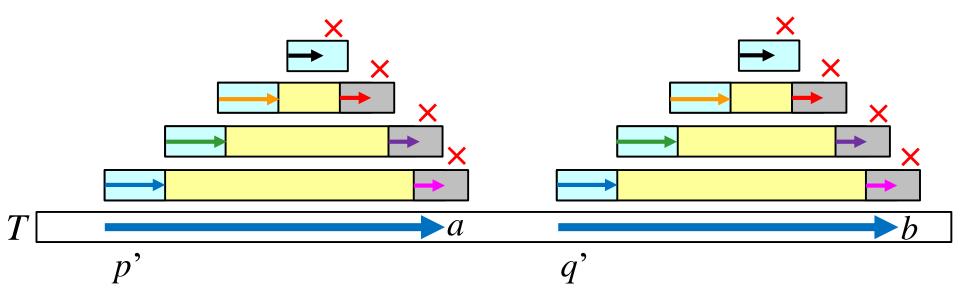
7. In a top-down manner, we compare the right boundary signatures of length  $\Delta_R + O(1)$ until we find the first mismatch.



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## Analysis of LCE query time

- ✓ The paths from the root to the *p*'th and *q*'th leaves of the signature tree can be found in  $O(\log u)$  time, since its height is  $O(\log u)$ .
- ✓ The total number of signatures to re-compute and to compare is  $O(\log^* u \log L)$ , since:
  - $\blacktriangleright \quad \Delta_L \leq \log^* u + 6 \text{ and } \Delta_R \leq 4, \text{ and}$
  - the first mismatch is found at the (logL)th level from the bottom.
- ✓ Therefore, LCE query can be answered in  $O(\log u + \log^* u \log L)$  time.

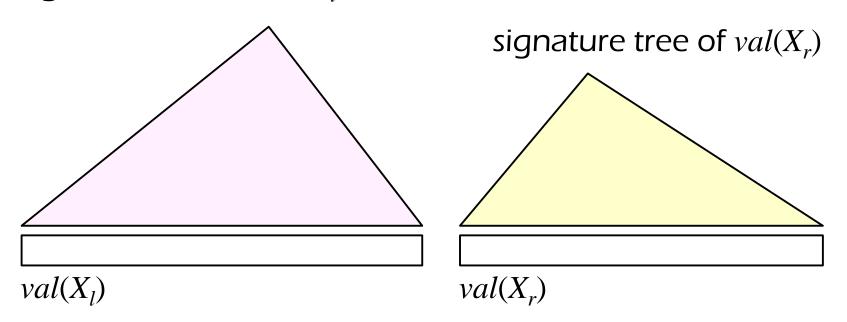
Lemma 3 (SLP to signature encoding)

Given an SLP  $S = \{X_i \rightarrow expr_i\}_{i=1}^n$  of size nwhich derives a string T of length u, we can compute the signature encoding of Tin  $O(n \log \log n \log^* u \log u)$  time.

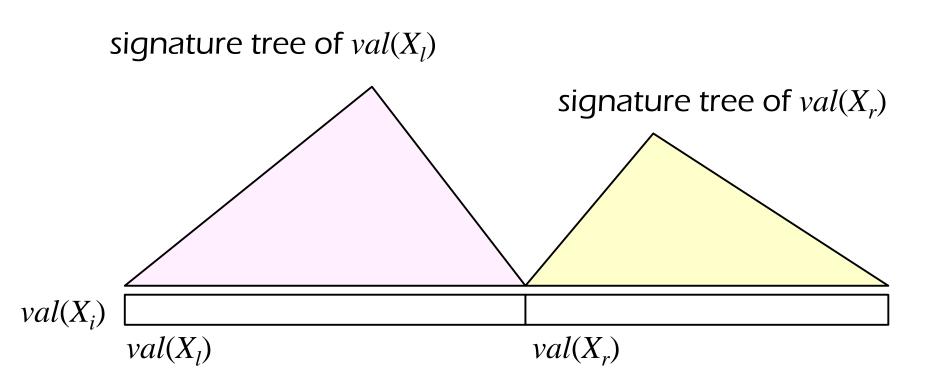
✓ In this talk I show a simpler  $O(n \log n \log^* u \log u)$ -time construction.

✓ Assume that, for a production  $X_i \rightarrow X_l X_r$ , we have computed the signature encodings of the decompressed strings  $val(X_l)$  and  $val(X_r)$ .

signature tree of  $val(X_l)$ 

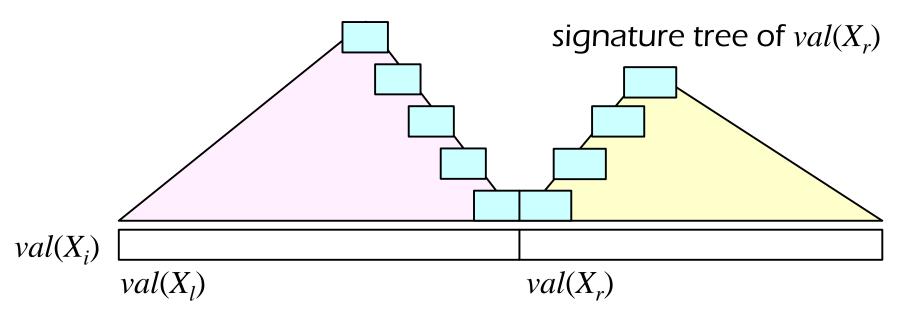


✓ By "concatenating" the signature trees of  $val(X_l)$  and  $val(X_r)$ , we obtain the signature tree of  $val(X_i)$ .

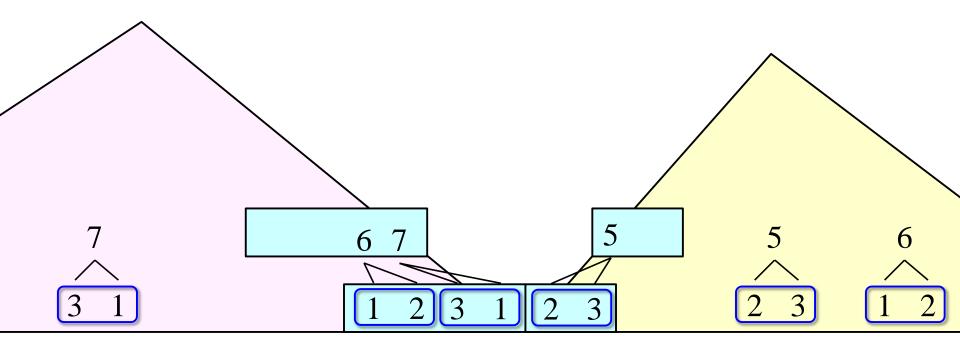


✓ In a bottom-up manner, we re-compute the boundary signatures of length  $\Delta_R$ +O(1) and  $\Delta_L$ +O(1) each, and concatenate the new signatures level-wise.

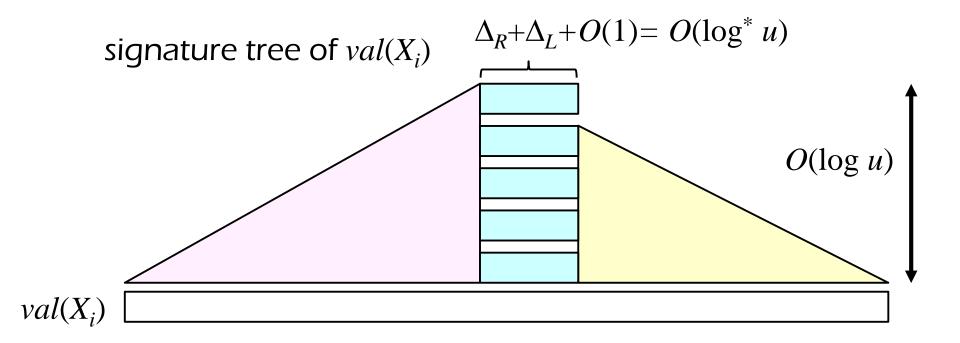
signature tree of  $val(X_l)$ 



 If a block of re-computed signatures already exists somewhere else, then we assign the same signature to the block at the next level.
 This is done in O(log n) time each, using a BST.



✓ Since the height of each signature tree is  $O(\log u)$ , we can compute the signature encoding of  $val(X_i)$  for each  $X_i$  in  $O(\log n \log^* u \log u)$  time.



### How much space?

Lemma 4 [Sahinalp & Vishkin, '95]

The number of signatures involved in the signature encoding of string *T* of length *u* is  $O(z \log^* u \log u)$ , where *z* is the number of factors in the Lempel-Ziv 77 factorization of *T*.

✓ In our data structure, we need an additive n term to store beginning positions of occurrences of all non-terminals in the derivation tree of  $X_n$ .

### Main result

#### Theorem 1

For any SLP  $S = {X_i \rightarrow expr_i}_{i=1}^n$  of size nwhich represents a string T of length u, there exists a data structure which

- > supports LCE in  $O(\log u + \log^* u \log L)$  time;
- > requires  $O(n + z \log^* u \log u)$  space;

> can be built in  $O(n \log \log n \log^* u \log u)$  time, where L is the LCE length and z is the size of the LZ77 factorization of T.

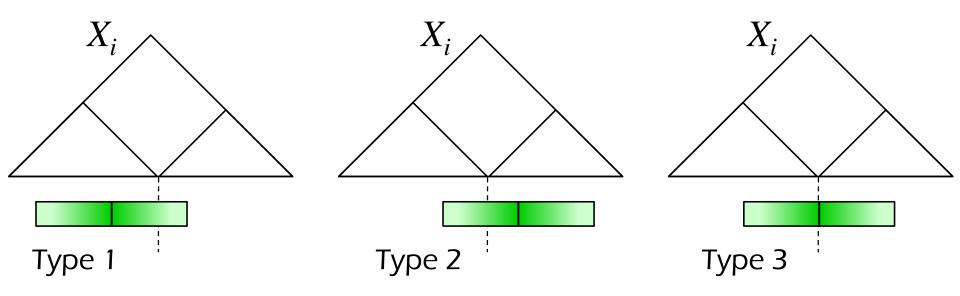
## App 1: Finding palindromes

Problem 2 (finding palindromes on SLP)

Given an SLP  $S = \{X_i \rightarrow expr_i\}_{i=1}^n$  representing a string T, compute a compact representation of all maximal palindromes in T.

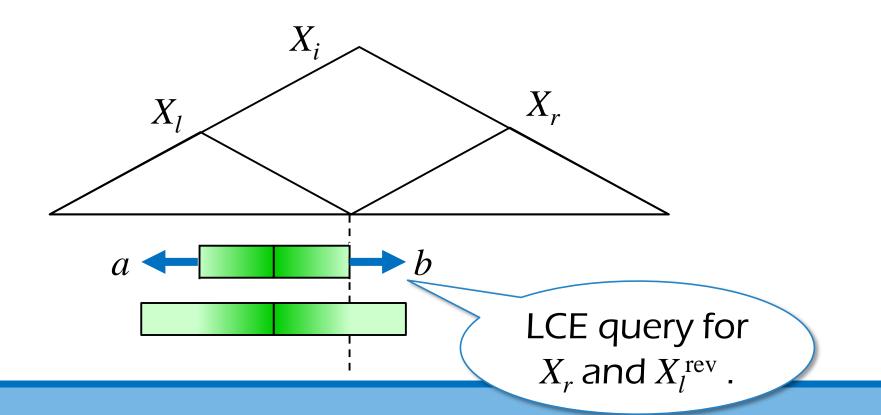
#### **Stabbed Palindromes**

✓ For each non-terminal  $X_i$ , there are 3 different types of "stabbed" maximal palindromes.



# Computing Type 1 Palindromes

✓ Each Type 1 maximal palindrome of  $X_i$ can be computed by <u>extending the arms</u> of a suffix palindrome of  $X_l$ .



### **Suffix Palindromes**

Lemma 5 [Apostolico et al., '95]

For any string of length k, the lengths of its suffix palindromes can be represented by  $O(\log k)$  arithmetic progressions.

 We can extend the arms of the suffix palindromes belonging to the same arithmetic progression in a batch, using periodicity.

## App 1: Finding Palindromes

#### Theorem 2

Given an SLP of size *n*, an  $O(n \log u)$ -size representation of all maximal palindromes of string *T* can be computed in  $O(n \log^* u \log^2 u)$  time.

With this representation, given an interval [i, j], we can decide whether the substring T[i..j] is a maximal palindrome or not in  $O(\log u)$  time.

## App 2: Comparing Suffixes on SLP

Problem 3 (lexicographical comparison of suffixes)

Preprocess an input SLP representing string *T* so that later, any suffixes of the string *T* can be lexicographically compared efficiently.

# App 2: Comparing Suffixes on SLP

#### Theorem 3

We can preprocess an input SLP of size *n* representing string *T* of length *u* in  $O(n \log \log n \log^* u \log u)$  time such that later, any suffixes of *T* can be lexicographically compared in  $O(\log u + \log^* u \log L)$  time, where *L* is the length of the LCP of the suffixes.

 ✓ Since the height of the signature tree is O(log u), this theorem is immediate from our LCE data structure.

## App 3: Lyndon factorization on SLP

Problem 4 (Lyndon factorization on SLP)

Given an SLP  $S = \{X_i \rightarrow expr_i\}_{i=1}^n$  representing a string T, compute the factor boundaries of the Lyndon factorization of T.



#### Definition

A string is said to be a Lyndon word if it is lexicographically smaller than any of its proper cyclic shifts.

For example, "aaaab", "abc", "bcbcc" are Lyndon words.

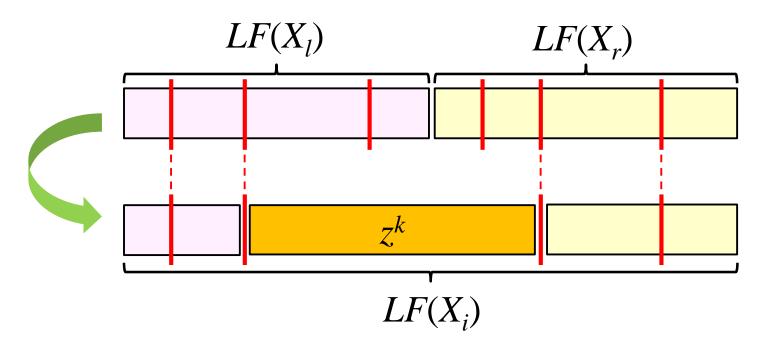
### Lyndon factorization

#### Definition

The Lyndon factorization LF(T) of a string T is the factorization  $u_1^{p_1}, \ldots, u_m^{p_m}$  of T such that  $u_1, \ldots, u_m$  is a sequence of Lyndon words in lexicographical descending order, and  $p_i \ge 1$ .

$$T = a b c | a b b | a b b | a b b | a a b c | a a | a | a | a | u_4 |$$

### Lyndon factorization on SLP



- ✓ I et al. showed an algorithm which computes  $LF(X_i)$  with  $X_i \rightarrow X_l X_r$  in the above manner.
- ✓ The beginning and ending positions of the median Lyndon factor z<sup>k</sup> can be found by a binary search based on <u>lex-comparison of suffixes</u>.

## App 3: Lyndon factorization on SLP

#### Theorem 4

Given an SLP of size *n* representing string *T* of length *u*, we can compute the factor boundaries of the Lyndon factorization of *T* in  $O(n \log \log n \log^* u \log u)$  time and  $O(n^2 + z \log^* u \log u)$  space.

### **Conclusions & further work**

- We proposed a new LCE algorithm on SLPs with  $O(\log u + \log^* u \log L)$  query time.
  - $\checkmark$  This is the fastest deterministic solution to date.
  - More details can be found in our arxiv paper: "Dynamic index, LZ factorization, and LCE queries in compressed space".
- Lower bound?
- Other applications?