

WAAC2024

LZ78 Substring Compression in CDAWG-compressed space

Hiroki Shibata¹, Dominik Köppl²

¹. Kyushu University

². University of Yamanashi

LZ78 Factorization [Ziv & Lempel, '78]

The **LZ78 factorization** of a string T is a factorization

$$T = F_0 F_1 \dots F_f$$

T' is the unfactorized part of T .

where F_i ($i \geq 1$) is the longest prefix of $T' = F_i \dots F_f$ that can be represented by $F_i = F_j c$ ($j < i, c \in \Sigma$).

$$T = \text{a b a a b a a c} = F_0 F_1 \dots F_f$$

$$F = (\varepsilon, \text{a}, \text{b}, \text{aa}, \text{ba}, \text{ac})$$

F' is a compressed representation of T .

$$F' = ((0, \text{a}), (0, \text{b}), (1, \text{a}), (2, \text{a}), (1, \text{c}))$$

($F_0 = \varepsilon$ is the empty string)

Substring Compression Problem

- The text T of length n is given in advance.
 - We can construct an index of T before the queries.
- Queries:
 - **Input:** two integers l, r ($1 \leq l \leq r \leq n$)
 - **Output:** The compressed representation of $T[l..r]$.

T We only consider the case $(l, r) = (1, n)$ in this presentation, but the algorithms can be extended for arbitrary (l, r) .

→ The LZ78 factorization of $T[l..r]$ is (b, a, ab, aa) .

Previous Work

We focus on **LZ78 substring compression problem**.

Recently, [Köppl, '21] proposed a method for LZ78 substring compression.

- This method is time optimal but consumes $O(n)$ words of space.

Time/Space Complexity

	Space for Index	Working Space	Preprocessing Time	Query Time
[Köppl, '21]	$O(n)$	$O(z_{l,r})$	$O(n)$	$O(z_{l,r})$

($z_{l,r}$ is the number of LZ78 factors of $T[l..r]$.)

Our Work

We propose a method for LZ78 substring compression **in compressed space**.

Time/Space Complexity

	Space for Index	Working Space	Preprocessing Time	Query Time
[Köppl, '21]	$O(n)$	$O(z_{l,r})$	$O(n)$	$O(z_{l,r})$
Ours	$O(e)$	$O(z_{l,r})$	$O(n)$	$O(z_{l,r} \log n)$

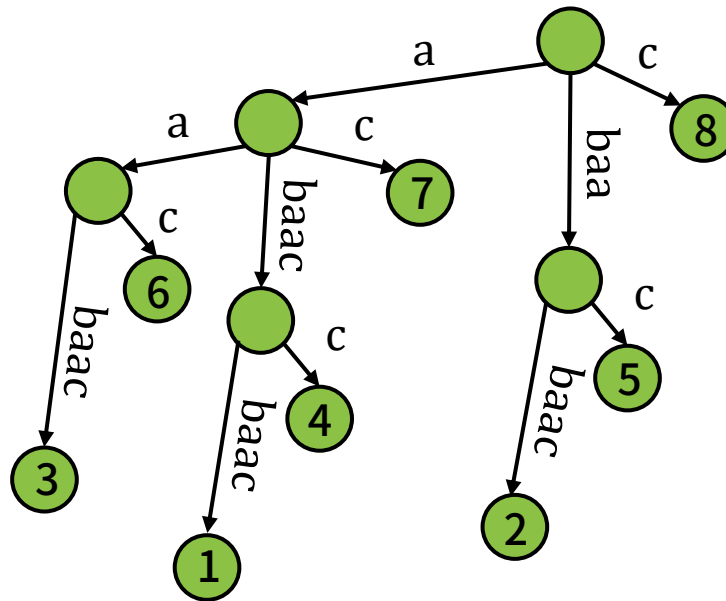
Our method is the space-efficient variant of [Köppl, '21], which will be recalled in the next slides.

($z_{l,r}$ is the number of LZ78 factors of $T[l..r]$.)
 (e is the number of the edges of the CDAWG of T .)

Computing LZ78 by **suffix trees** (previous method)

Suffix Trees (ST)

Suffix Tree: The compact trie representing all suffixes of T .



$T = \text{abaabaac}$

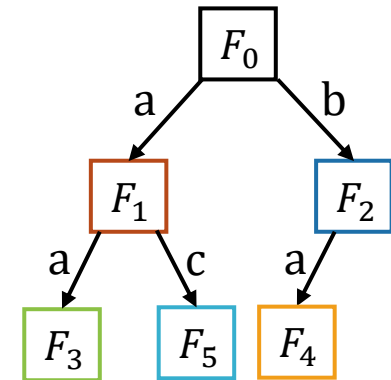
LZ78 Tries

LZ78 Trie: The trie consisting of all LZ78 factors of T .

- The nodes have a one-to-one correspondence with each LZ78 factor.

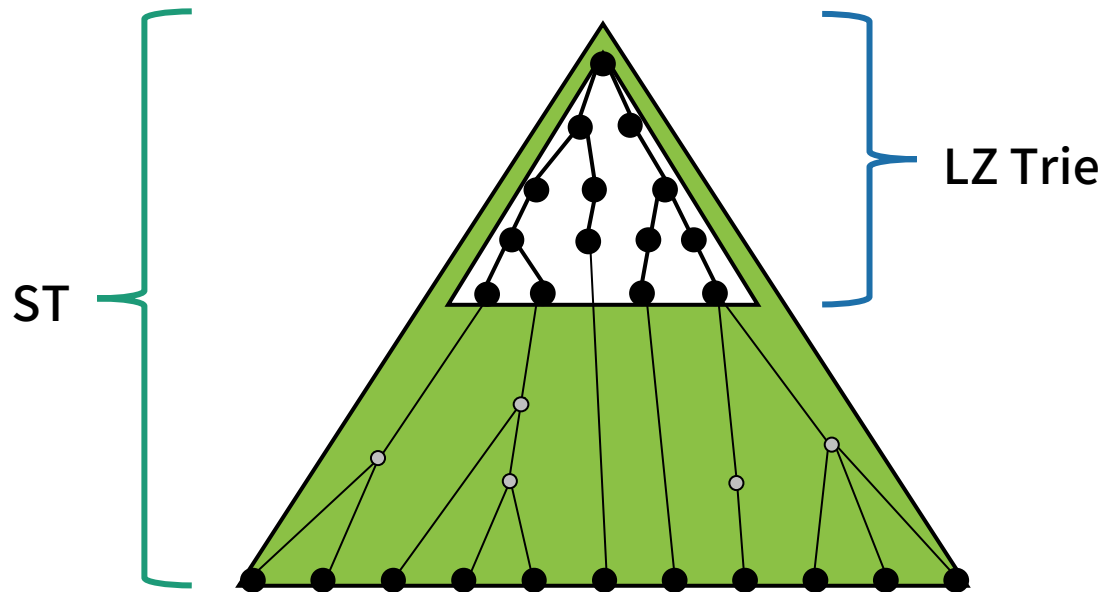
$$T = \text{a b a a b a a c} = F_0 F_1 \dots F_f$$

$$F = (\varepsilon, \text{a}, \text{b}, \text{aa}, \text{ba}, \text{ac})$$



Superimposing LZ78 trie onto ST

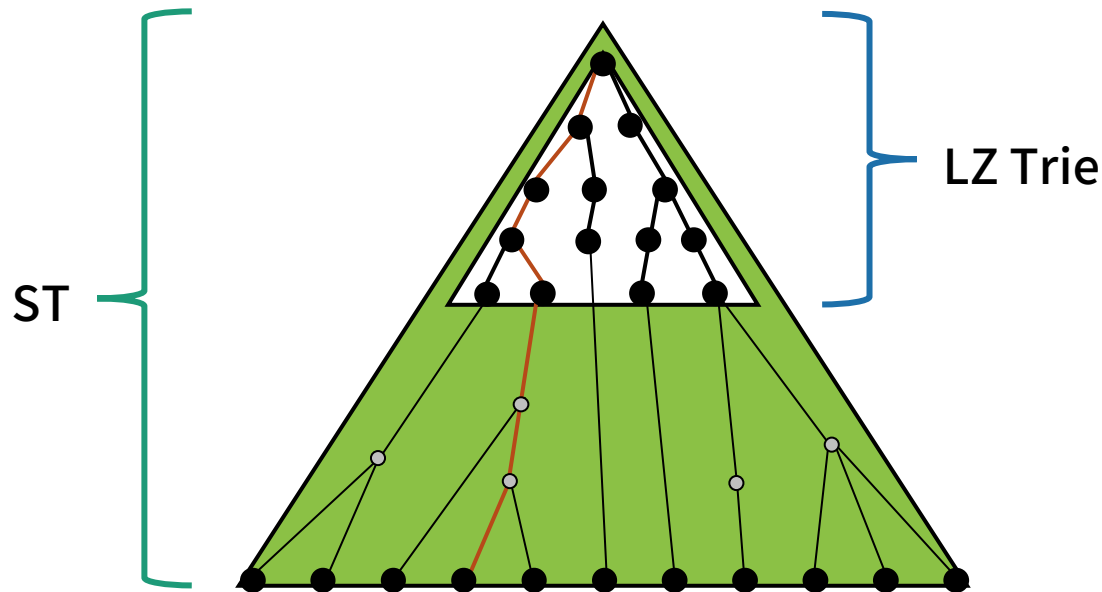
- We can superimpose the LZ78 trie onto the ST.
 - The LZ trie is an induced subgraph over the ST consisting only of the LZ78 factors.



Computing LZ78 by ST

■ The new factor can be computed as follows:

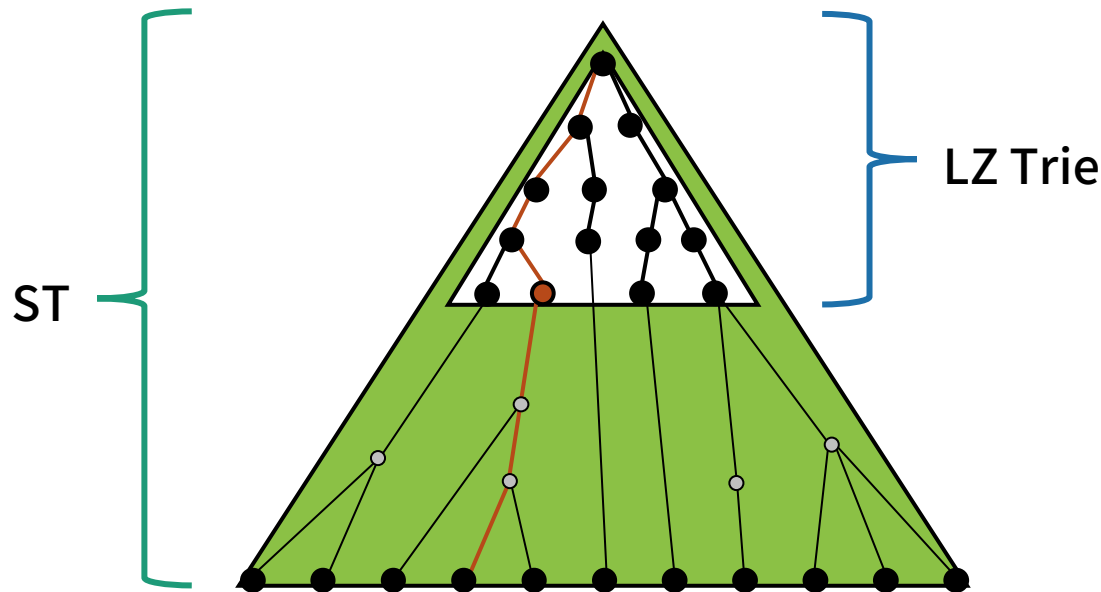
1. Find the path representing the unfactorized part of T .
2. Find the lowest LZ78 node on the path.
3. Add an LZ78 node immediately below the lowest LZ78 node.



Computing LZ78 by ST

■ The new factor can be computed as follows:

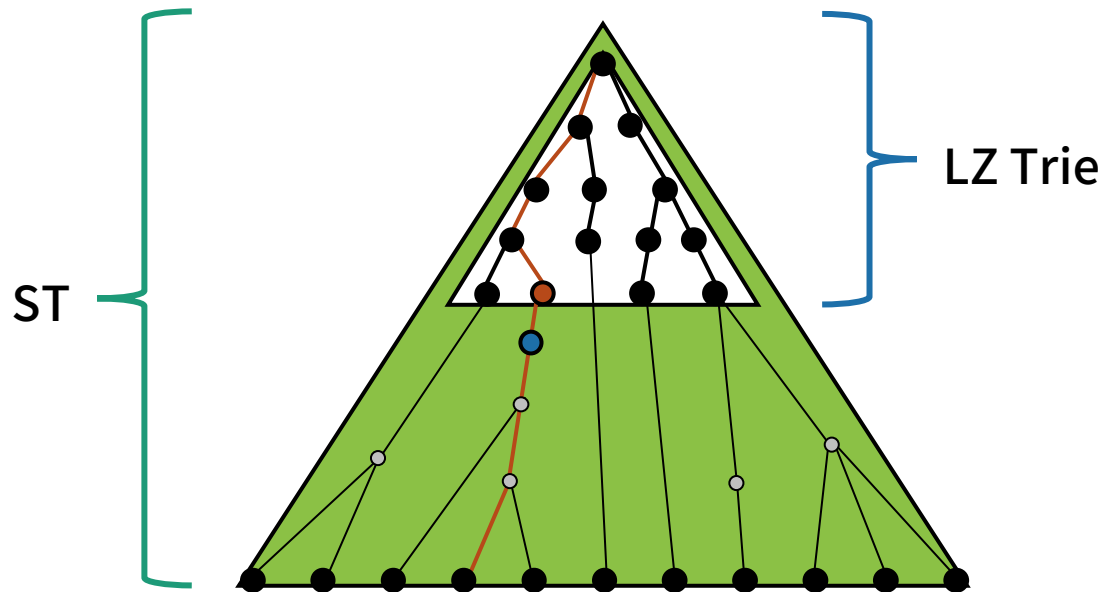
1. Find the path representing unfactorized suffix of T .
2. Find the lowest LZ78 node on the path.
3. Add an LZ78 node immediately below the lowest LZ78 node.



Computing LZ78 by ST

■ The new factor can be computed as follows:

1. Find the path representing unfactorized suffix of T .
2. Find the lowest LZ78 node on the path.
3. Add an LZ78 node immediately below the lowest LZ78 node.



Implementation and Complexity

Required data structures:

- Lowest Marked Ancestor (LMA) [Westbrook, 1992]
 - ▲ amortized $O(1)$ time / query
- Weighted Level Ancestor [Gawrychowski et al., 2014]
 - ▲ $O(1)$ time / query

Time / Space complexity

- Each data structure can be stored in $O(n)$ words.
- We can find the lowest factor and add a factor in constant time per factor.

■ Overall Complexity $\Rightarrow O(n)$ words $\cdot O(z_{l,r})$ time / query

($z_{l,r}$ is the number of LZ78 factors of $T[l..r]$)

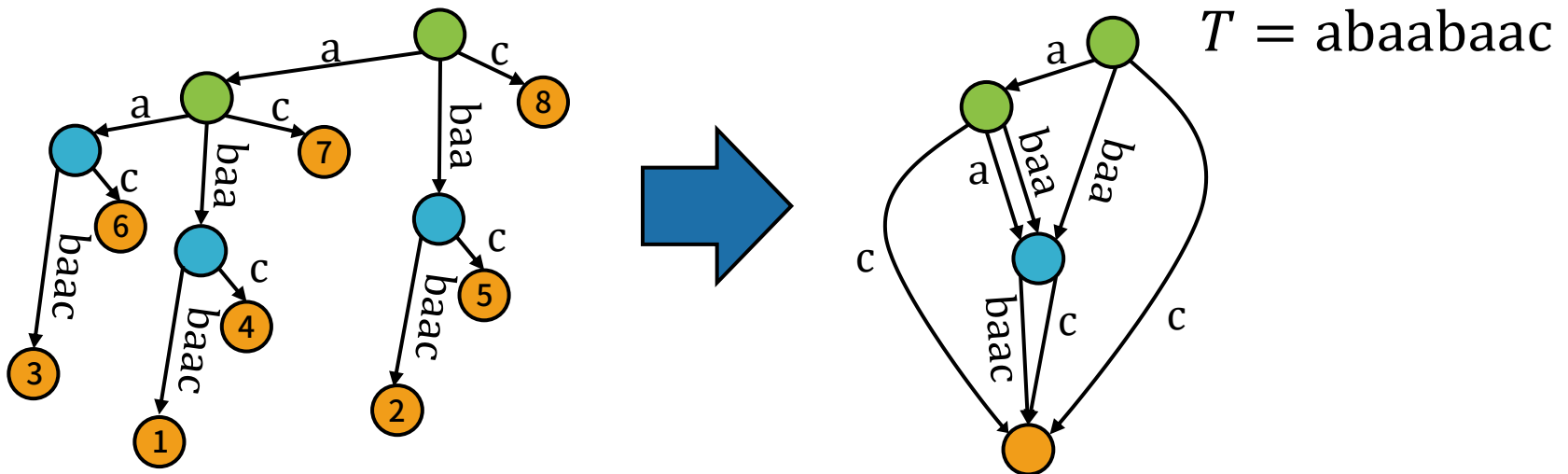
Computing LZ78 **in compressed space** (proposed method)

CDAWG (Compact Directed Acyclic Word Graph)

CDAWG: The edge-labelled DAG which obtained by merging isomorphic subtrees of the corresponding ST.

- **Property**: The number e of edges of the CDAWG is small for some highly repetitive strings.

→ CDAWG can be regarded as a compressed representation of STs.



Why CDAWG cannot simply replace ST?

Replacing ST with CDAWG is difficult because

1. several edges can end at the same node, and
2. a node of CDAWG can represent several strings.

So we use an additional data structure.

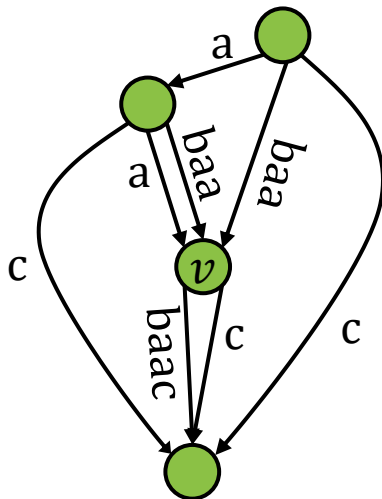


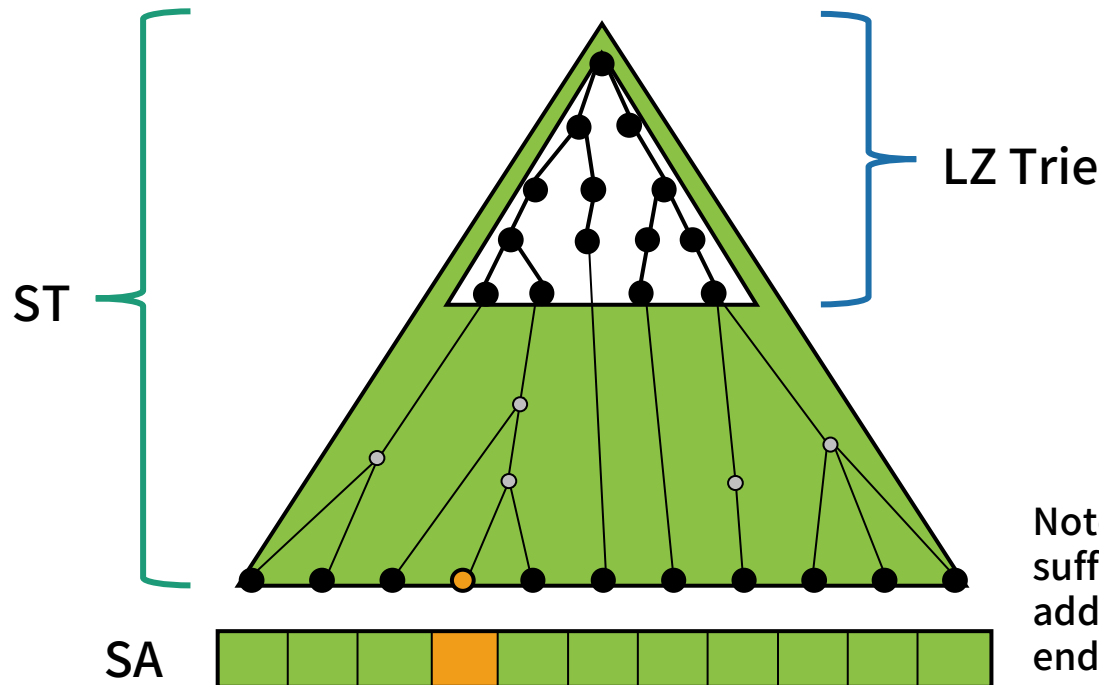
Fig: The CDAWG of $T = \{aba, baa, ba\}$.

- v represents **abaa**, **baa**, and **ba**.
- The indegree of v is 3.

Suffix Arrays (SA)

The **suffix array** stores the lexicographic order of all suffixes.

- Since the leaves have a one-to-one correspondence to all suffixes, the SA represents the order of the leaves.
- One leaf of the ST corresponds to one position on the SA.

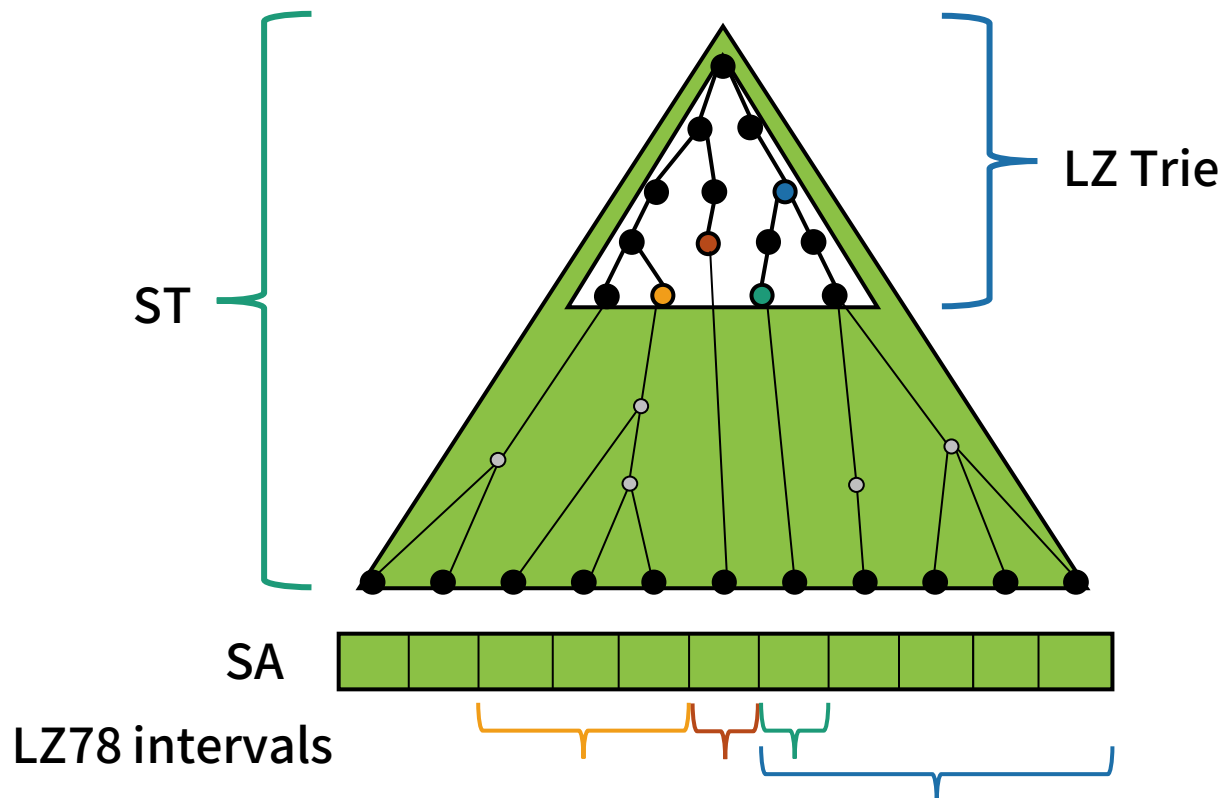


Note: We can guarantee that each suffix corresponds to a leaf node by adding a unique character at the end of T .

Converting LZ78 Nodes to Intervals

Each LZ78 node corresponds to an interval on SA.

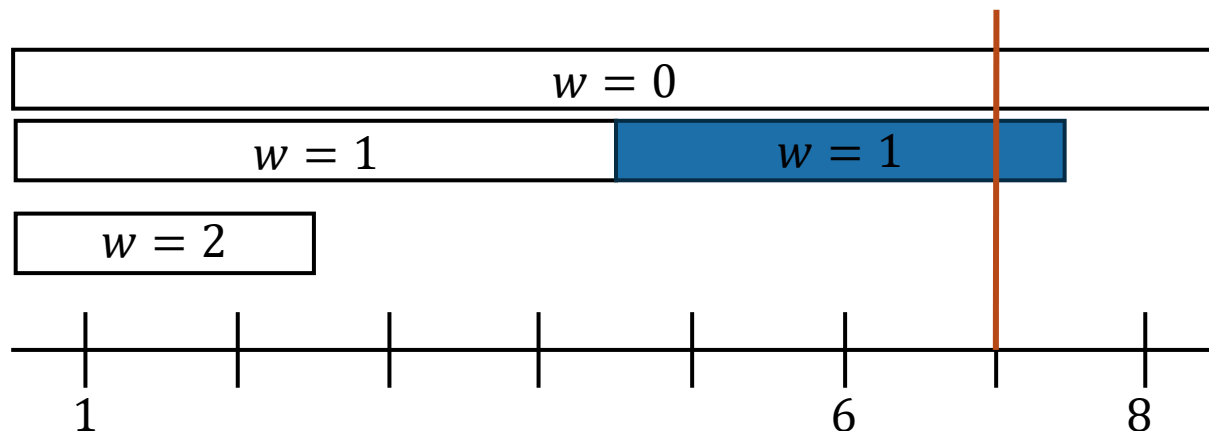
→ The set of all LZ78 nodes can be represented by the set of intervals.



Stabbing-Max Problem

Finding lowest LZ78 node can be reduced to the following queries and operations:

1. **Find the interval** $[a, b] \in S$ **containing** k **whose weight is maximum.**
 - Corresponding to find the lowest LZ node.
2. **Add an interval** $[a, b]$ **with weight** w **to a set** S .
 - Corresponding to add an LZ node.



Stabbing-Max Problem

Finding lowest LZ78 node can be reduced to the following queries and operations:

1. **Find the interval** $[a, b] \in S$ containing k whose weight is maximum.
2. **Add an interval** $[a, b]$ with weight w to a set S .

This problem is known as the **stabbing-max problem**, and there is a data structure that performs any query with the following complexity [Tarjan, 1979]:

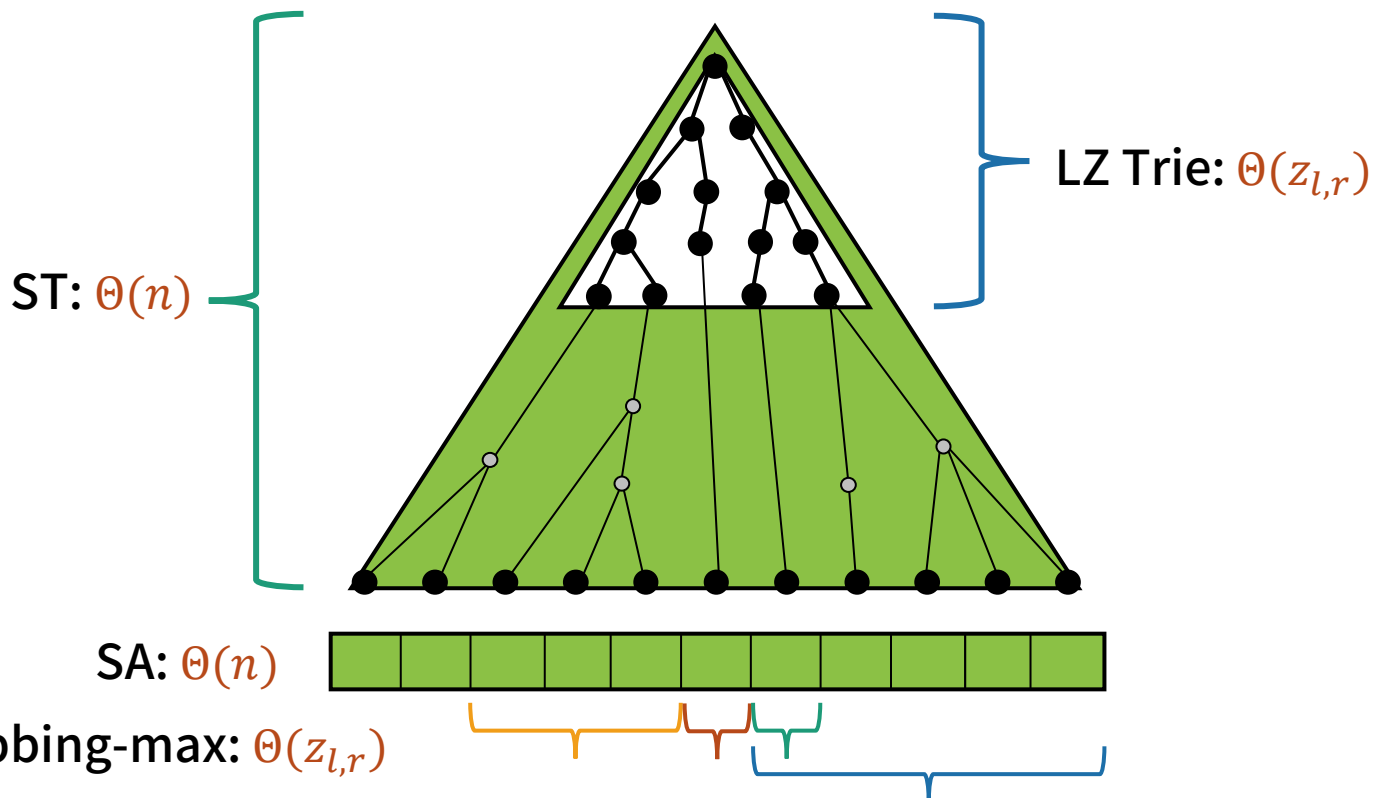
- Add/Find an interval: $O(\log m)$ time / query
- Space complexity: $O(m)$ words

(m is the number of intervals)

Bottleneck of Space Complexity

Now, our data structure uses $\Theta(n)$ space because of the ST and the SA.

To reduce the space, we need to compute LZ78 factors **without them**.

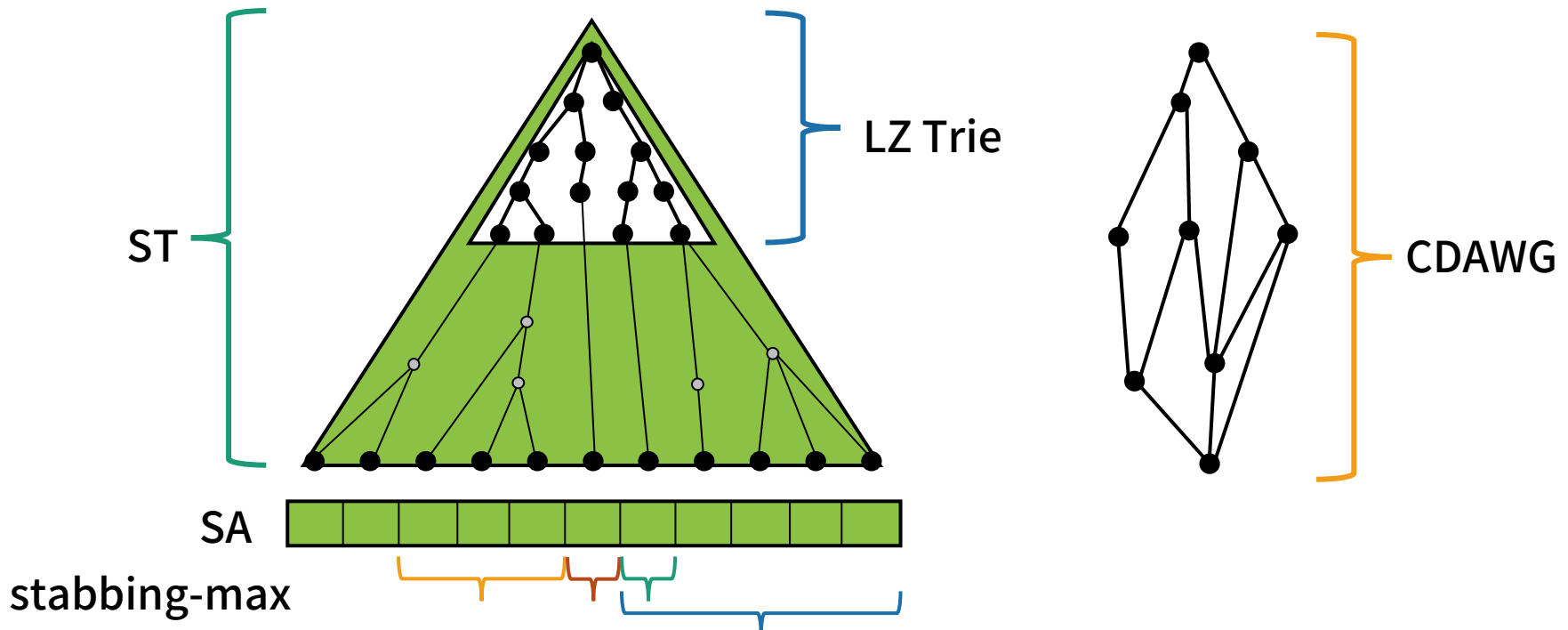


Note: $z_{l,r} \in O(n)$

Replacing ST/SA with CDAWG

Since CDAWG is a compacted variant of ST, some CDAWG-based index efficiently performs ST/SA operation.

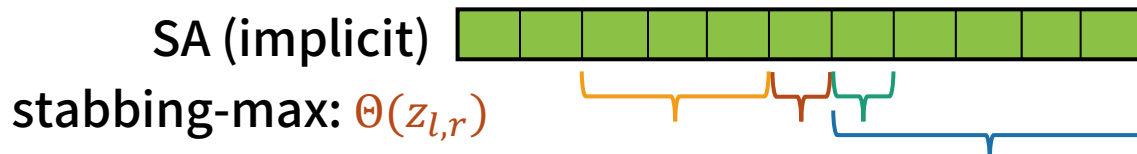
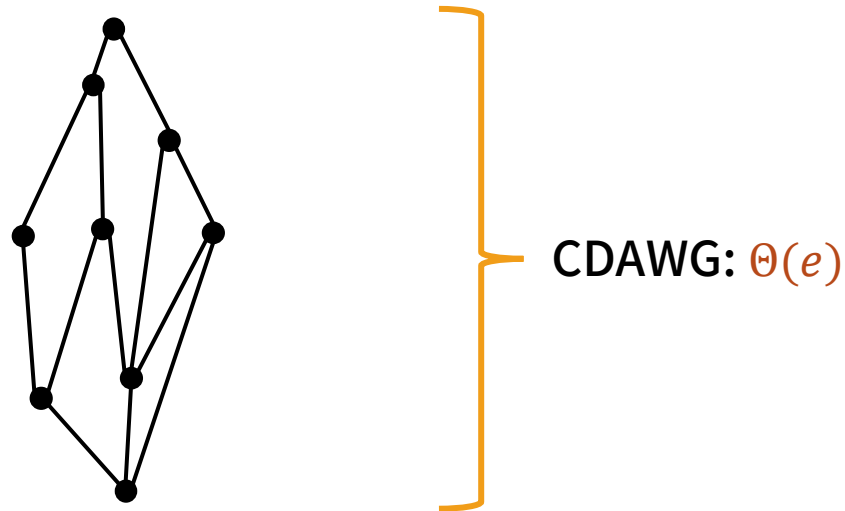
There is a CDAWG-based index that performs ST/SA operation in $O(\log n)$ time and is stored in $O(e)$ space. [Bealazzougui and Cunial, CPM 2017]



Overall Structure

Our method only uses **the CDAWG** and **the stabbing-max structure**.

- Space for index: $\Theta(e)$ words
- Working space for queries: $\Theta(z_{l,r})$ words
- Query time: $O(z_{l,r} \log n)$



Conclusion

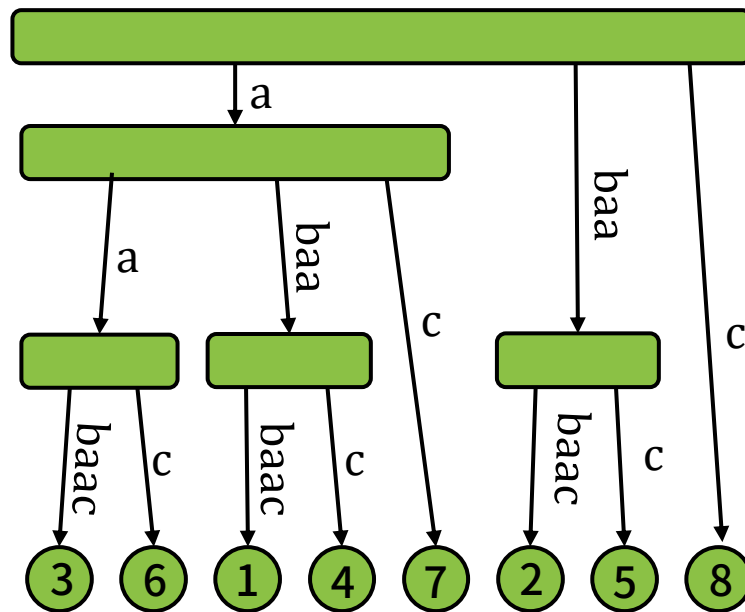
- We proposed a method for **LZ78 substring compression in compressed space**.
- Some applications:
 - We can replace the CDAWG by some other compressed index.
 - Applying this method for other LZ78-like compressions. (LZD, LZMW)

Time/Space Complexity

	Space for Index	Working Space	Preprocessing Time	Query Time
[Köppl, '21]	$O(n)$	$O(z_{l,r})$	$O(n)$	$O(z_{l,r})$
Ours	$O(e)$	$O(z_{l,r})$	$O(n)$	$O(z_{l,r} \log n)$

Suffix Trees (ST)

Suffix Tree: The compact trie representing all suffixes of T .



$T = \text{abaabaac}$

LZ78 Factorization [Ziv & Lempel, '78]

- One of a text compression method.
- Factorize a string T to $T = F_0F_1 \dots F_f$ by a specific algorithm.

$$T = \text{abbabaaab} = F_0F_1 \dots F_f$$

$$F = (\varepsilon, \text{a}, \text{b}, \text{ba}, \text{baa}, \text{ab})$$

($F_0 = \varepsilon$ is the empty string)

LZ78 Factorization [Ziv & Lempel, '78]

■ F_i ($i \geq 1$) is computed as follows:

1. Compute the longest prefix of $T' = T[1 + |F_0| + |F_1| + \dots + |F_{i-1}| .. n]$ that appears in F .
2. Set $F_i = F_j T'[\ell + 1]$, where F_j is the longest factor that precedes T' .

$$T = \text{abbabaaab} = F_0 F_1 \dots F_f \quad (F_0 = \varepsilon)$$

$$T' = \text{abbabaaab}$$

$$F = (\varepsilon)$$

LZ78 Factorization [Ziv & Lempel, '78]

■ F_i ($i \geq 1$) is computed as follows:

1. Compute the longest prefix of $T' = T[1 + |F_0| + |F_1| + \dots + |F_{i-1}|..n]$ that appears in F .
2. Set $F_i = F_j T'[\ell + 1]$, where F_j is the longest factor that precedes T' .

$T' = \text{abbabaaab}$

$F = (\epsilon, \text{a})$

LZ78 Factorization [Ziv & Lempel, '78]

■ F_i ($i \geq 1$) is computed as follows:

1. Compute the longest prefix of $T' = T[1 + |F_0| + |F_1| + \dots + |F_{i-1}|..n]$ that appears in F .
2. Set $F_i = F_j T'[\ell + 1]$, where F_j is the longest factor that precedes T' .

$T' = \text{a}\text{b}\text{babaaab}$

$F = (\epsilon, \text{a}, \text{b})$

LZ78 Factorization [Ziv & Lempel, '78]

■ F_i ($i \geq 1$) is computed as follows:

1. Compute the longest prefix of $T' = T[1 + |F_0| + |F_1| + \dots + |F_{i-1}|..n]$ that appears in F .
2. Set $F_i = F_j T'[\ell + 1]$, where F_j is the longest factor that precedes T' .

$T' = \text{ab}\text{b}\text{a}\text{b}\text{a}\text{a}\text{a}\text{b}$

$F = (\epsilon, \text{a}, \text{b}, \text{ba})$

LZ78 Factorization [Ziv & Lempel, '78]

■ F_i ($i \geq 1$) is computed as follows:

1. Compute the longest prefix of $T' = T[1 + |F_0| + |F_1| + \dots + |F_{i-1}|..n]$ that appears in F .
2. Set $F_i = F_j T'[\ell + 1]$, where F_j is the longest factor that precedes T' .

$T' = \text{abba} \textcolor{brown}{baa} \text{ab}$

$F = (\epsilon, a, b, \textcolor{blue}{ba}, \textcolor{brown}{baa})$

LZ78 Factorization [Ziv & Lempel, '78]

■ F_i ($i \geq 1$) is computed as follows:

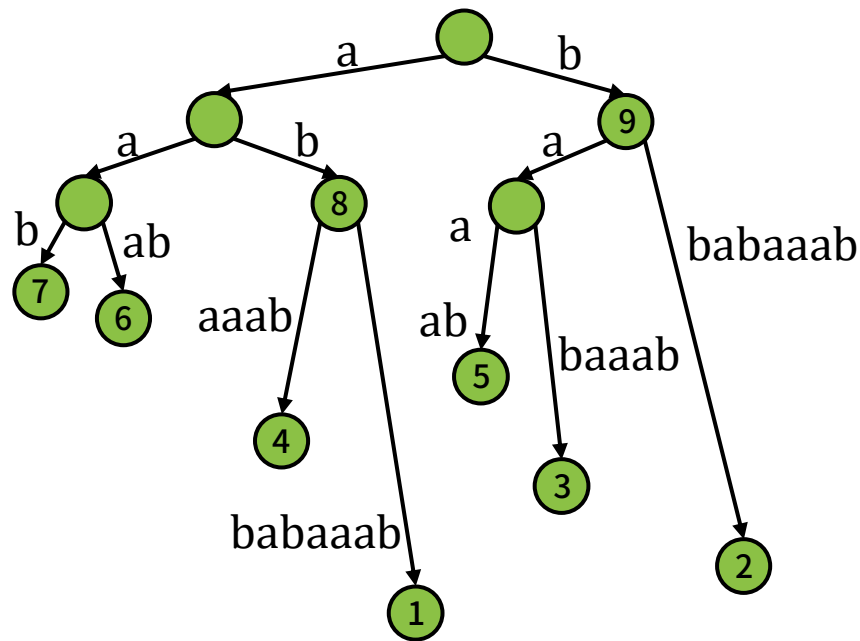
1. Compute the longest prefix of $T' = T[1 + |F_0| + |F_1| + \dots + |F_{i-1}|..n]$ that appears in F .
2. Set $F_i = F_j T'[\ell + 1]$, where F_j is the longest factor that precedes T' .

$T' = \text{abbabaaab}$

$F = (\epsilon, \text{a}, \text{b}, \text{ba}, \text{baa}, \text{ab})$

Suffix Trees (ST)

Suffix Tree: The compact trie representing all suffixes of T .



$T = \text{abbabaaab}$

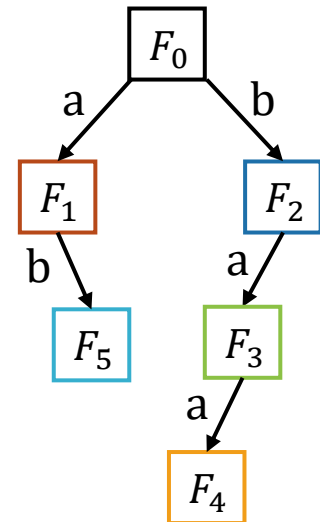
LZ78 Tries

LZ78 Trie: The trie consisting of all LZ78 factors of T .

- The nodes have a one-to-one correspondence with each LZ78 factor.

$$T = \text{abbabaaab} = F_0 F_1 \dots F_f$$

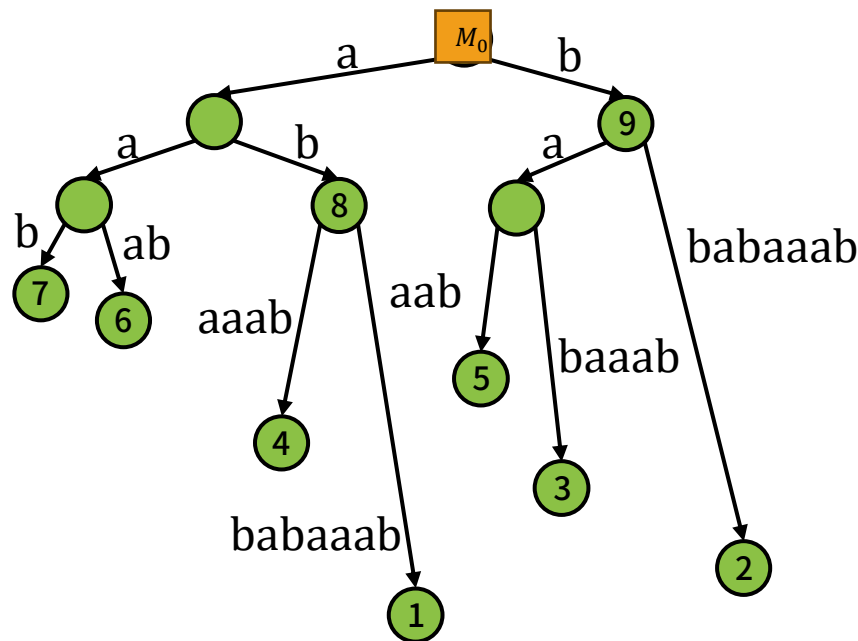
$$F = (\varepsilon, \text{a}, \text{b}, \text{ba}, \text{baa}, \text{ab})$$



Computing LZ78 by ST

- F_i ($i \geq 1$) can be computed as follows:

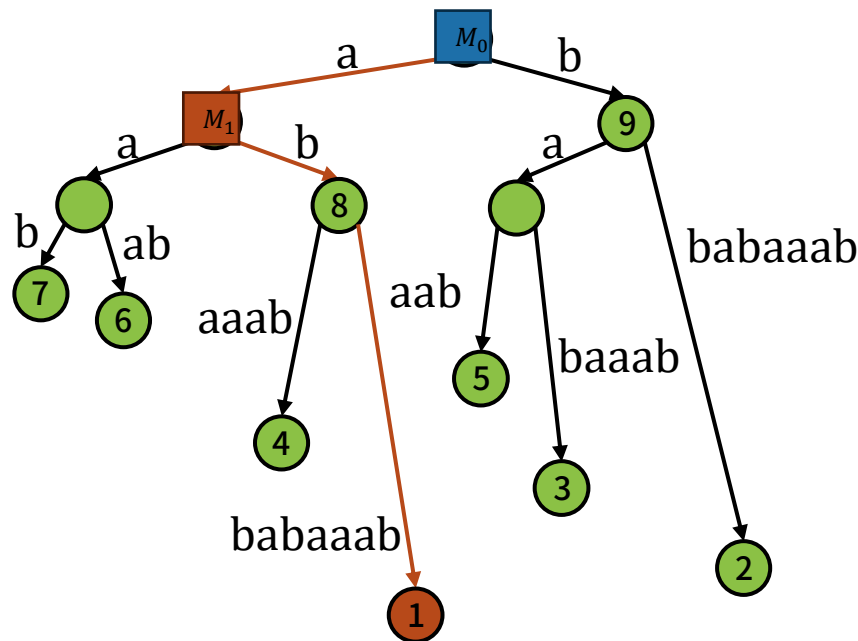
1. Find the path on the ST representing $T' = T[1 + |F_0| + |F_1| + \dots, |F_{i-1}|..n]$.
2. Find the lowest mark M_j on the path.
3. Set $F_i = F_j T' [|F_j| + 1]$ and add a mark M_i to the position on the ST corresponding to F_i .


$$T' = \text{abbabaaab}$$
$$F = (\varepsilon)$$

Computing LZ78 by ST

- F_i ($i \geq 1$) can be computed as follows:

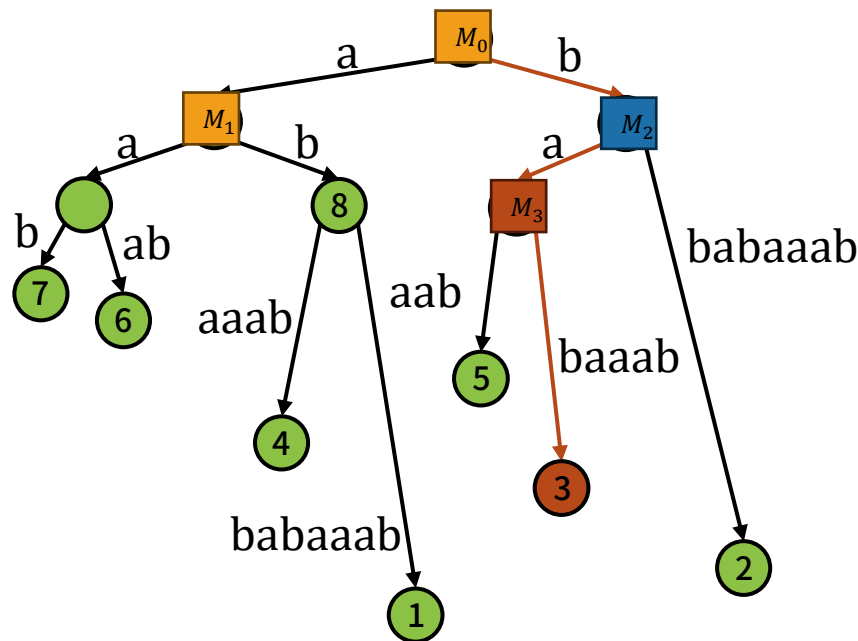
1. Find the path on the ST representing $T' = T[1 + |F_0| + |F_1| + \dots, |F_{i-1}|..n]$.
2. Find the lowest mark M_j on the path.
3. Set $F_i = F_j T' [|F_j| + 1]$ and add a mark M_i to the position on the ST corresponding to F_i .


$$T' = \text{abbabaaab}$$
$$F = (\varepsilon, \mathbf{a})$$

Computing LZ78 by ST

■ F_i ($i \geq 1$) can be computed as follows:

1. Find the path on the ST representing $T' = T[1 + |F_0| + |F_1| + \dots, |F_{i-1}| \dots n]$.
2. Find the lowest mark M_j on the path.
3. Set $F_i = F_j T' [|F_j| + 1]$ and add a mark M_i to the position on the ST corresponding to F_i .



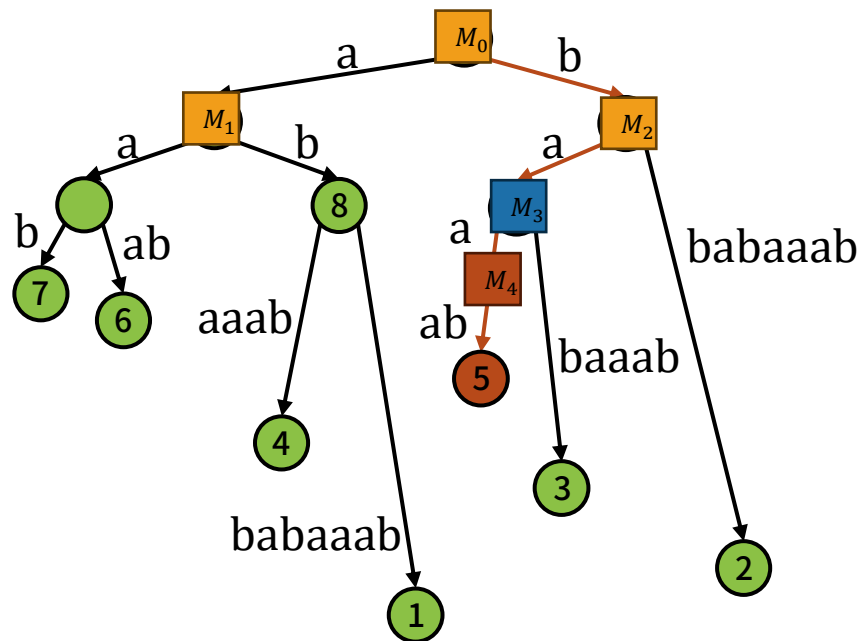
$T' = \text{ab} \text{b} \text{a} \text{b} \text{a} \text{a} \text{a} \text{b}$

$F = (\epsilon, \text{a}, \text{b}, \text{ba})$

Computing LZ78 by ST

■ F_i ($i \geq 1$) can be computed as follows:

1. Find the path on the ST representing $T' = T[1 + |F_0| + |F_1| + \dots, |F_{i-1}| \dots n]$.
2. Find the lowest mark M_j on the path.
3. Set $F_i = F_j T' [|F_j| + 1]$ and add a mark M_i to the position on the ST corresponding to F_i .



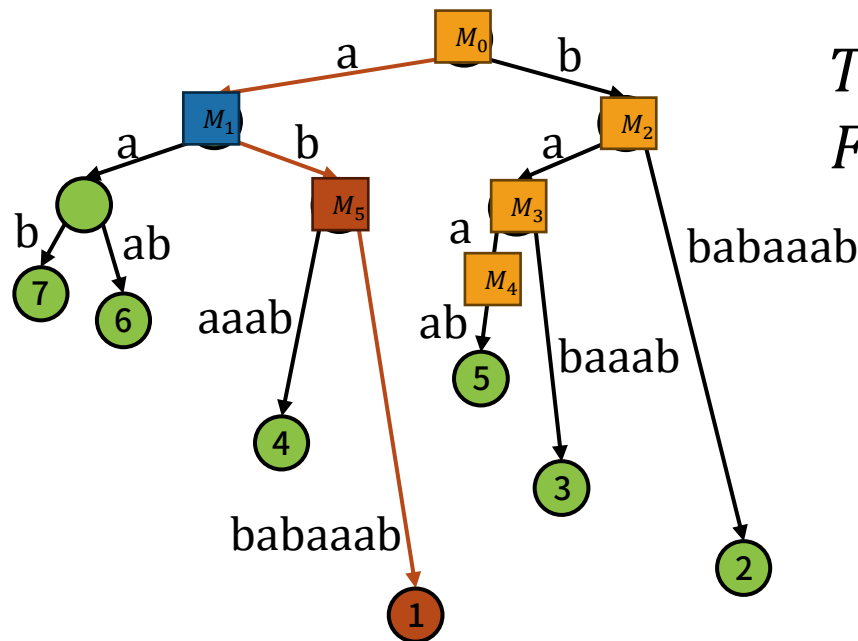
$T' = \text{abba} \textcolor{brown}{b} \textcolor{brown}{a} \textcolor{brown}{a} \textcolor{brown}{b}$

$F = (\epsilon, a, b, \textcolor{blue}{b} \textcolor{blue}{a}, \textcolor{brown}{b} \textcolor{brown}{a} \textcolor{brown}{a})$

Computing LZ78 by ST

■ F_i ($i \geq 1$) can be computed as follows:

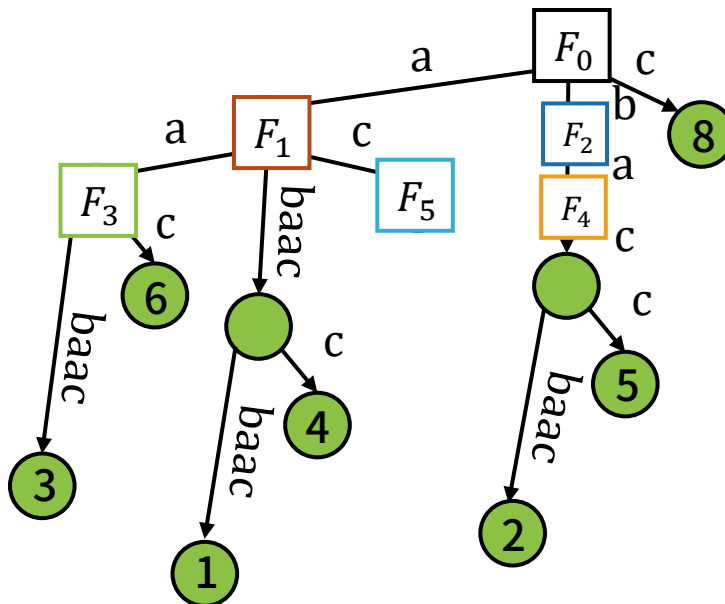
1. Find the path on the ST representing $T' = T[1 + |F_0| + |F_1| + \dots, |F_{i-1}| \dots n]$.
2. Find the lowest mark M_j on the path.
3. Set $F_i = F_j T' [|F_j| + 1]$ and add a mark M_i to the position on the ST corresponding to F_i .



$T' = \text{abbabaaab}$
 $F = (\epsilon, \text{a}, \text{b}, \text{ba}, \text{baa}, \text{ab})$

Superimposing LZ78 trie and the ST

- We superimpose the LZ78 trie on the ST.



$T = \text{a b a a b a a c}$

$F = (\epsilon, \text{a}, \text{b}, \text{aa}, \text{ba}, \text{ac})$