

# Suffix Trees

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- String Indexing/String Dictionaries
- Tries
- Suffix Trees

Inge Li Gørtz

# Suffix Trees

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- String Dictionaries
- Tries
- Suffix Trees

## String Indexing

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- **String indexing problem.** Let  $S$  be a string of characters from alphabet  $\Sigma$ . Preprocess  $S$  into data structure to support:
  - $\text{search}(P)$ : Return the starting positions of all occurrences of  $P$  in  $S$ .
- **Example.**
  - $S = \text{yabbadabbado}$
  - $\text{search(abba)} = \{1, 6\}$
- **String dictionary problem.** Let  $S = \{S_1, S_2, \dots, S_k\}$  be a set of strings of characters from alphabet  $\Sigma$ . Preprocess  $S$  into data structure to support:
  - $\text{search}(P)$ : Return yes if  $P = S_i$  for some  $S_i$  in  $S$ .
  - $\text{prefix-search}(P)$ : Return all strings in  $S$  for which  $P$  is a prefix.

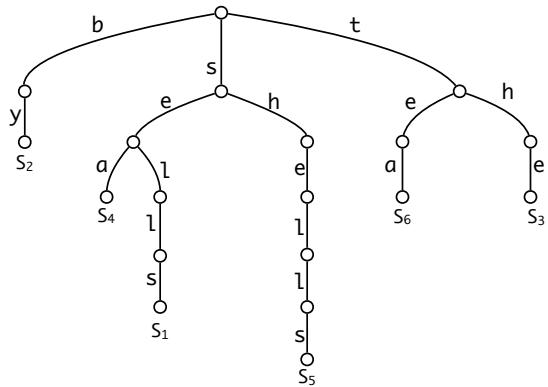
## Suffix Trees

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## Tries

- Text retrieval

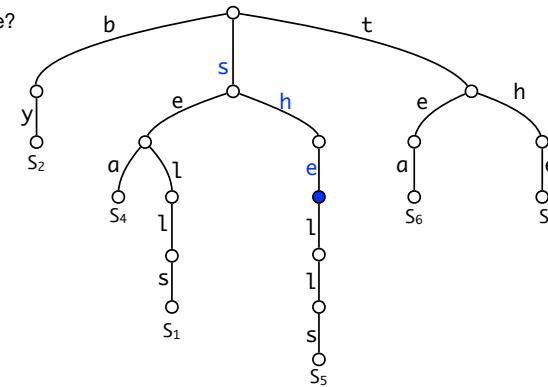


- Trie over the strings: sells, by, the, sea, shells, tea.

## Tries

- Text retrieval

- Prefix-free?

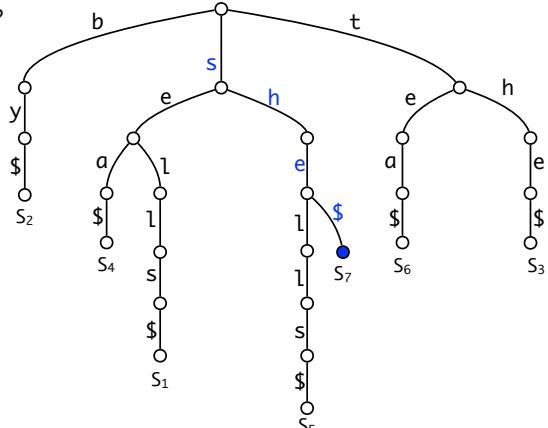


- Trie over the strings: sells, by, the, sea, shells, tea, she.

## Tries

- Text retrieval

- Prefix-free?



- Trie over the strings: sells\$, by\$, the\$, sea\$, shells\$, tea\$, she\$.

## Tries

- Fredkin 1960]. Retrieval.** Store a set of strings in a rooted tree such that:

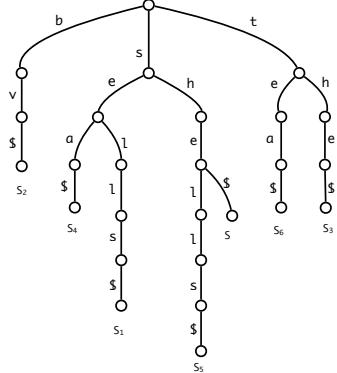
- Each edge is labeled by a character. Edges to children of a node are sorted from left-to-right alphabetically.
- Each root-to-leaf path represents a string in the set. (obtained by concatenating the labels of edges on the path).
- Common prefixes share same path maximally.

- Properties of the trie.** A trie  $T$  storing a collection  $S$  of  $s$  strings of total length  $n$  from an alphabet of size  $d$  has the following properties:

- How many children can a node have?
- How many leaves does  $T$  have?
- What is the height of  $T$ ?
- What is the number of nodes in  $T$ ?

## Tries

- [Fredkin 1960]. Retrieval. Store a set of strings in a rooted tree such that:
  - Each edge is labeled by a character. Edges to children of a node are sorted from left-to-right alphabetically.
  - Each root-to-leaf path represents a string in the set. (obtained by concatenating the labels of edges on the path).
  - Common prefixes share same path maximally.
- Properties of the trie. A trie  $T$  storing a collection  $S$  of  $s$  strings of total length  $n$  from an alphabet of size  $d$  has the following properties:
  - How many children can a node have? at most  $d$
  - How many leaves does  $T$  have?  $s$
  - What is the height of  $T$ ? length of longest string
  - What is the number of nodes in  $T$ ?  $O(n)$

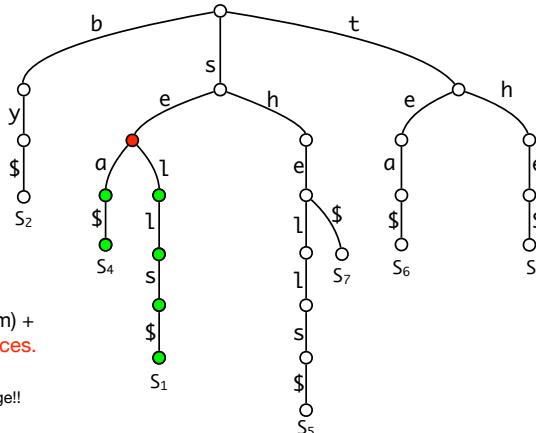


## Trie

- Search time:  $O(d)$  in each node  $\Rightarrow O(dm)$ .
  - $O(m)$  if  $d$  constant.
  - $d$  not constant: use dictionary
    - Perfect hashing  $O(1)$
    - Balanced BST:  $O(\log d)$
- Time and space for a trie (for constant  $d$ ):
  - $O(m)$  for searching for a string of length  $m$ .
  - $O(n)$  space.
  - Preprocessing:  $O(n)$

## Tries

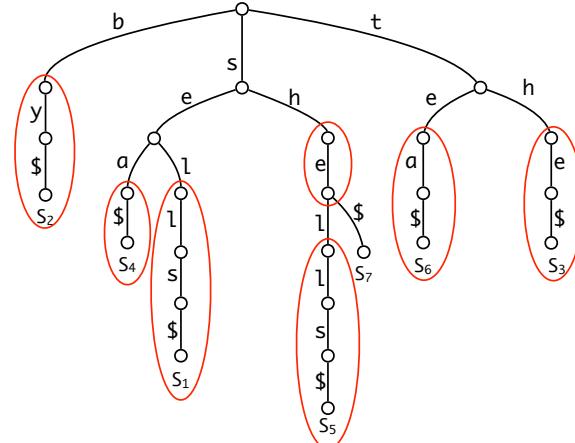
- Prefix search: return all words in the trie starting with "se"



- Time for prefix search:  $O(m) + \text{time to report all occurrences}$ .  
Could be large!!
- Solution: compact tries.

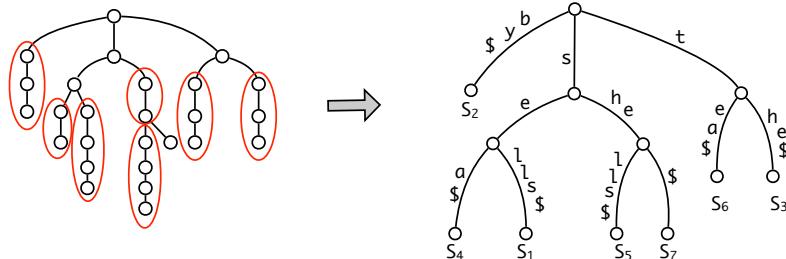
## Tries

- Compact trie. Chains of nodes with a single child is merged into a single edge.



## Tries

- **Compact trie.** Chains of nodes with a single child is merged into a single edge.



- **Properties of the compact trie.** A compact trie  $T$  storing a collection  $S$  of  $s$  strings of total length  $n$  from an alphabet of size  $d$  has the following properties:
  - Every internal node of  $T$  has at least 2 and at most  $d$  children.
  - $T$  has  $s$  leaves
  - The number of nodes in  $T$  is  $< 2s$ .

## Trie

- **Time and space for a compact trie (constant d).**

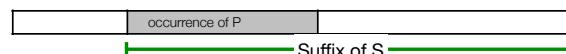
- $O(m)$  for searching for a string of length  $m$ .
- $O(m + occ)$  for prefix search, where  $occ = \# \text{occurrences}$
- $O(n)$  space.
- Preprocessing:  $O(n)$

## Suffix Trees

- String Dictionaries
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## Suffix tree

- **String indexing problem.** Given a string  $S$  of characters from an alphabet  $\Sigma$ . Preprocess  $S$  into a data structure to support
  - $\text{Search}(P)$ : Return starting position of all occurrences of  $P$  in  $S$ .
- Observation: An occurrence of  $P$  is a prefix of a suffix of  $S$ .

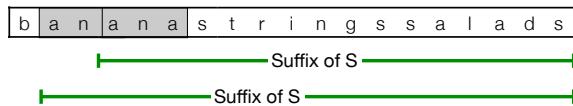


## Suffix tree

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  - $\text{Search}(P)$ : Return starting position of all occurrences of  $P$  in  $S$ .
- Observation: An occurrence of  $P$  is a prefix of a suffix of  $S$ .

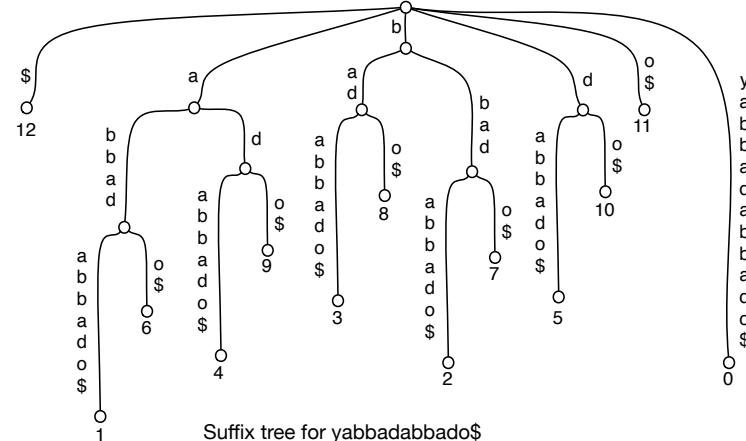


- Example:  $P = \text{ana}$ .



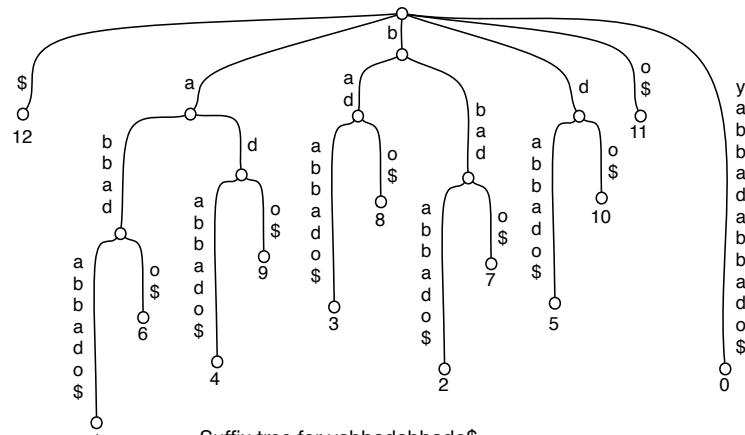
## Suffix Trees

- **Suffix trees.** The **compact trie** of all suffixes of  $S$ .

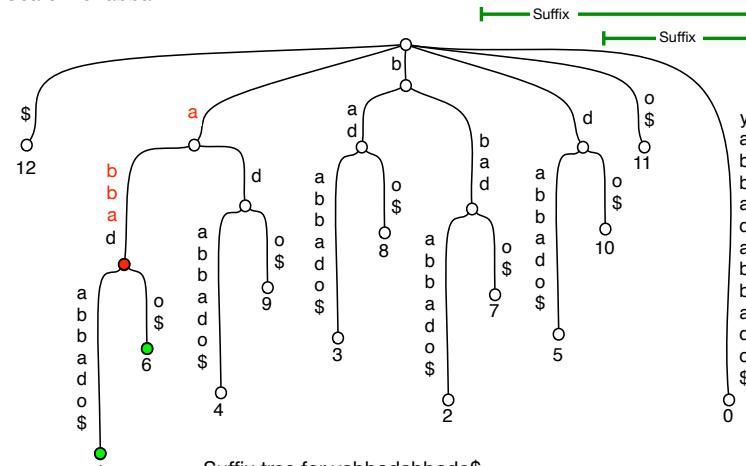


## Suffix Trees

- **Suffix trees.** The **compact trie** of all suffixes of  $S$ .
- Search for abba:

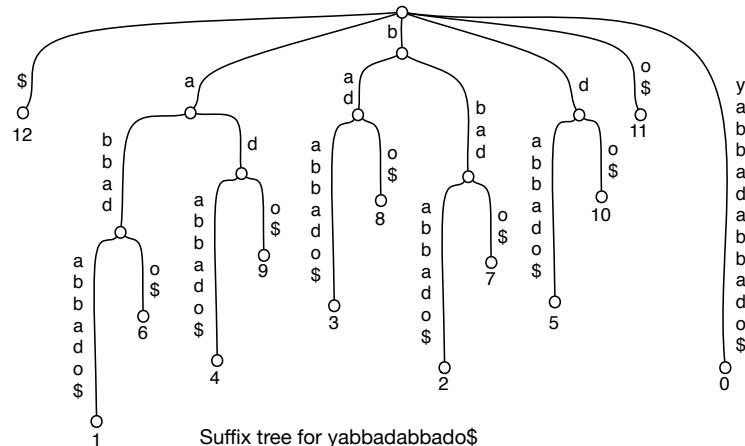


- **Suffix trees.** The **compact trie** of all suffixes of  $S$ .
- Search for abba:



## Suffix Trees

- Suffix trees. The **compact trie** of all suffixes of  $S$ .
- Space?

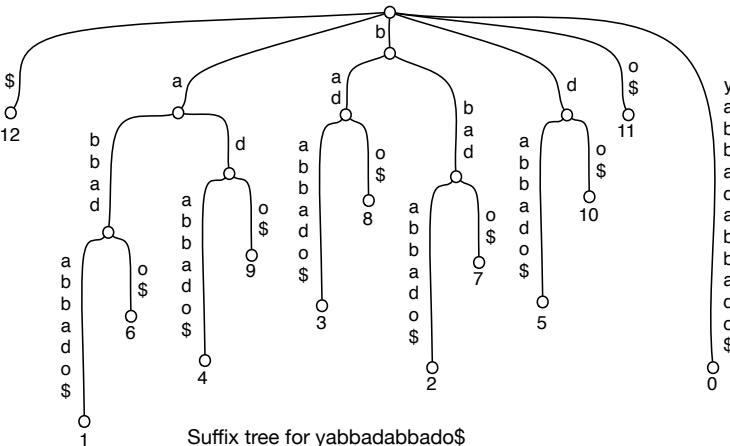


Suffix tree for yabbadabbado\$

## Suffix Trees

- Suffix trees. The **compact trie** of all suffixes of  $S$ .
- Store  $S$  and store edge labels by reference to  $S$ .

0 1 2 3 4 5 6 7 8 9 10 11 12  
y a b b a d a b b a d o \$

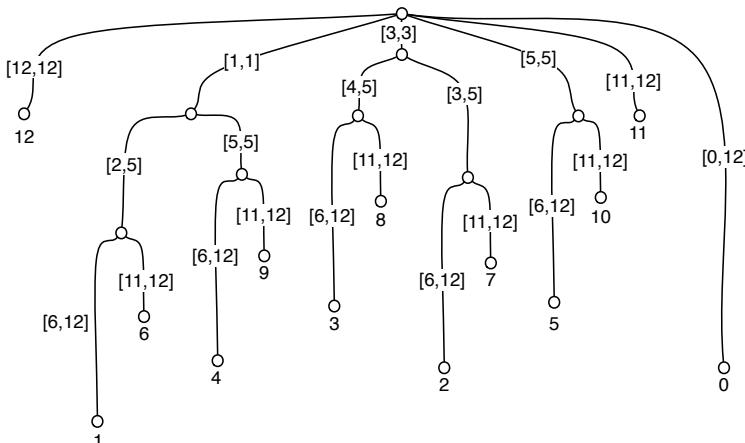


Suffix tree for yabbadabbado\$

## Suffix Trees

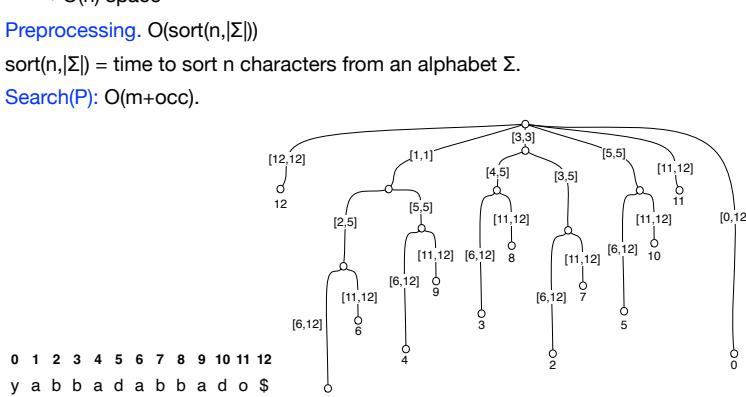
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0 1 2 3 4 5 6 7 8 9 10 11 12  
y a b b a d a b b a d o \$



## Suffix Trees

- Space.
  - Number of edges + space for edge labels + string
  - $\Rightarrow O(n)$  space
- Preprocessing.  $O(\text{sort}(n, |\Sigma|))$
- $\text{sort}(n, |\Sigma|) = \text{time to sort } n \text{ characters from an alphabet } \Sigma$ .
- Search(P):  $O(m+occ)$ .



Suffix tree for yabbadabbado\$

## Suffix Trees

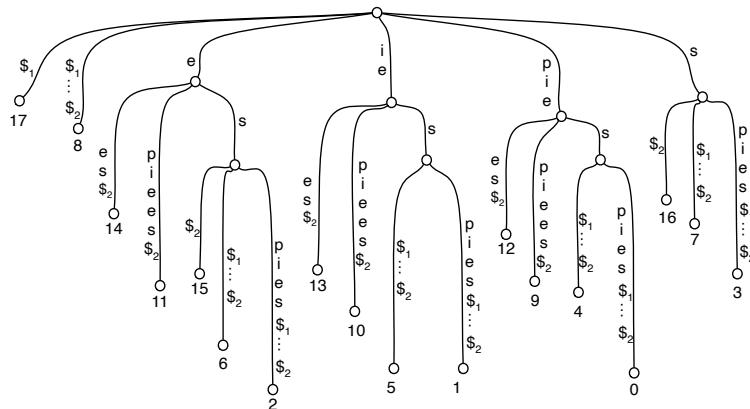
- **Theorem.** We can solve the string indexing problem in
    - $O(n)$  space and  $sort(n, |\Sigma|)$  preprocessing time.
    - $O(m + occ)$  time for queries.

## Suffix Trees

- Applications.
    - Approximate string matching problems
    - Compression schemes (Lempel-Ziv family, ...)
    - Repetitive string problems (palindromes, tandem repeats, ...)
    - Information retrieval problems (document retrieval, top-k retrieval, ...)
    - ...

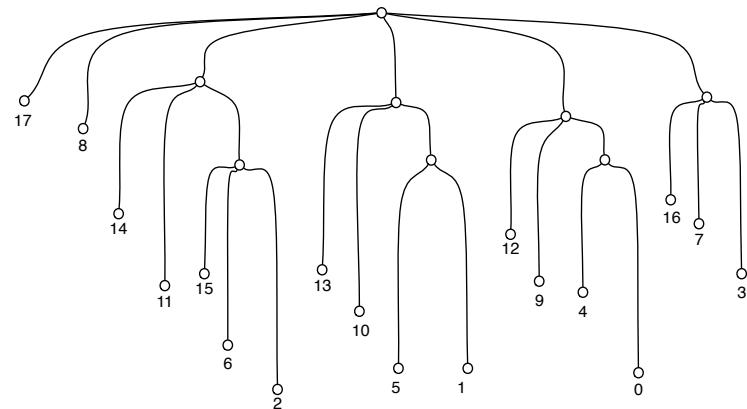
# Longest common substring

- Find longest common substring of strings  $S_1$  and  $S_2$ .
  - Construct the suffix tree over  $S_1\$S_2\$$ .
  - Example. Find longest common substring of  $\text{piespies}$  and  $\text{piepieies}$ :
    - Construct suffix tree of  $\text{piespies} \$ \text{piepieies} \$$ .



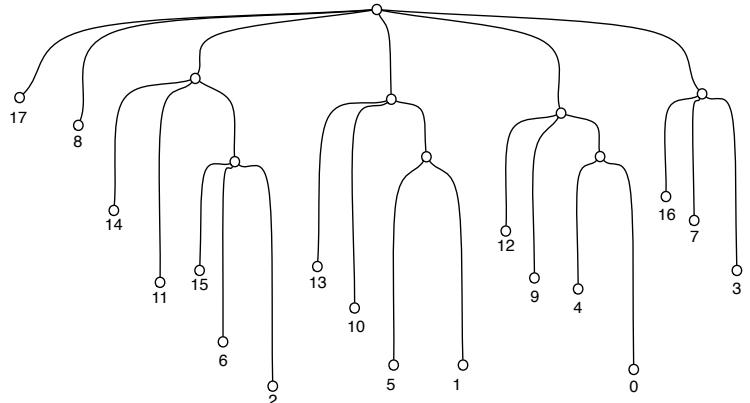
## Longest common substring

- Suffix tree of **piespies\$1piepiees\$2.**



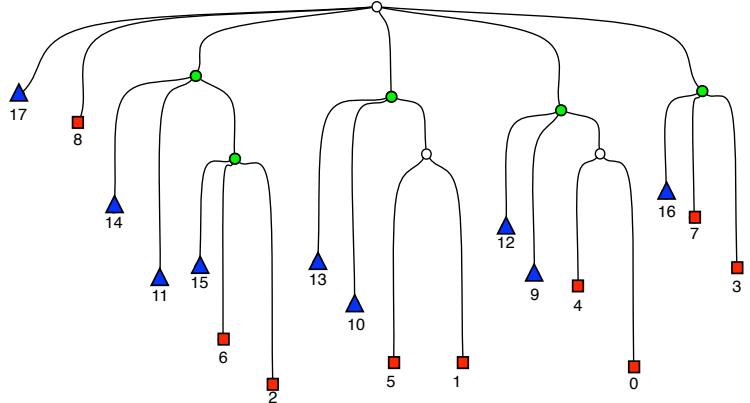
## Longest common substring

- Suffix tree of **piespies\$<sub>1</sub>piepiees\$<sub>2</sub>**.
- Mark leaves: ■ =  $S_1$  ▲ =  $S_2$



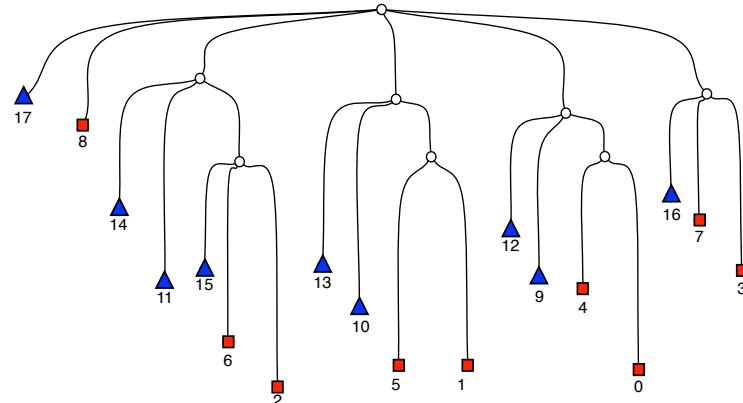
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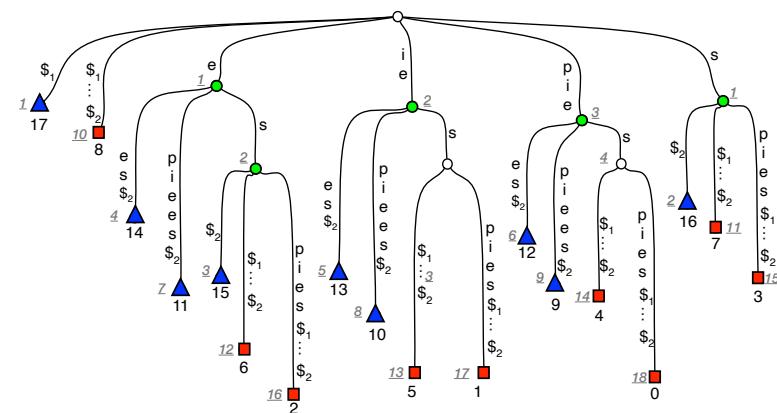
## Longest common substring

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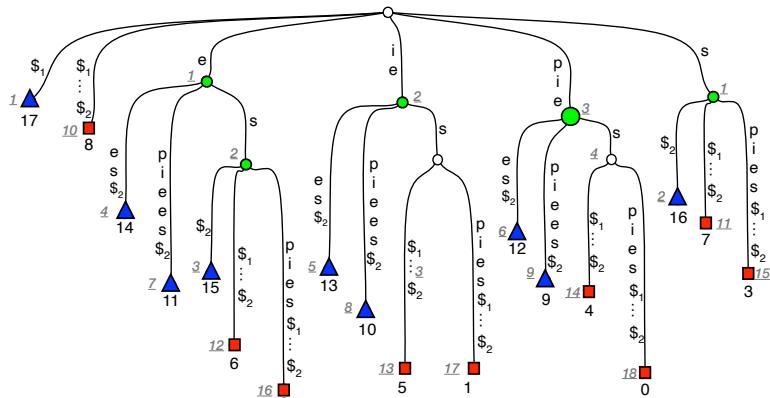
## Longest common substring

- Suffix tree of **piespies\$<sub>1</sub>piepiees\$<sub>2</sub>**.
- Mark leaves: ■ =  $S_1$  ▲ =  $S_2$
- Add string depth.



## Longest common substring

- Suffix tree of `piespies$1piepiees$2`.
- Mark leaves: ■ =  $S_1$  ▲ =  $S_2$
- Add string depth.



## Longest common substring

- Using a suffix tree we can solve the longest common substring problem in linear time (for a constant size alphabets).

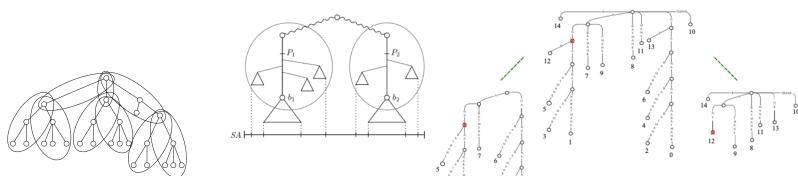
## Gapped Pattern Indexing

- Search for name:

"Inge Gørtz" or "Inge Li Gørtz" → "Inge" [1-4] "Gørtz"  
Gapped pattern

- Techniques:

- Clustering of the suffix tree
- Induced suffix tree decomposition: recursively divide the suffix tree in half by index in the string.



## Gapped Pattern Matching

- Search for my name:

"Inge Gørtz" or "Inge Li Gørtz" → "Inge" [1-4] "Gørtz"  
Gapped pattern

- General gapped pattern:

$$P_1 [a_1, b_1] P_2 [a_2, b_2] P_3 \dots [a_{k-1}, b_{k-1}] P_k$$

- Other variants (indexing):

- Wildcards
- Top-k closest consecutive occurrences