



Algorithms Theory

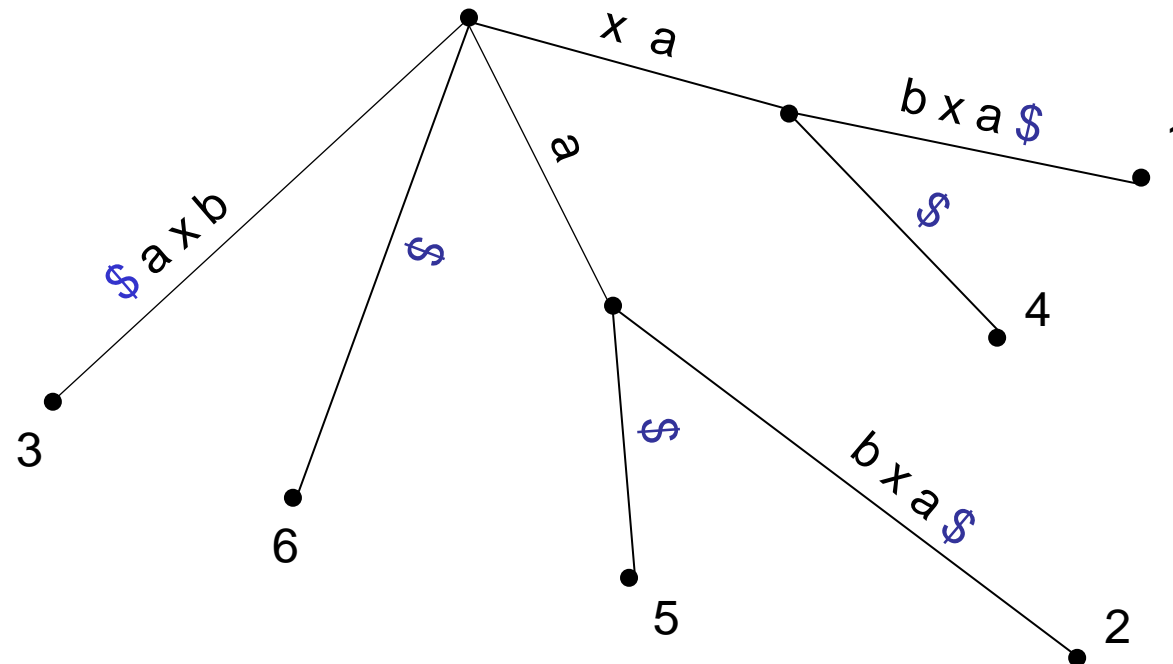
15 – Text Search (2)

Construction of suffix trees

Prof. Dr. S. Albers

Suffix tree

$t = x a b x a \$$
1 2 3 4 5 6



Ukkonen's algorithm: implicit suffix trees

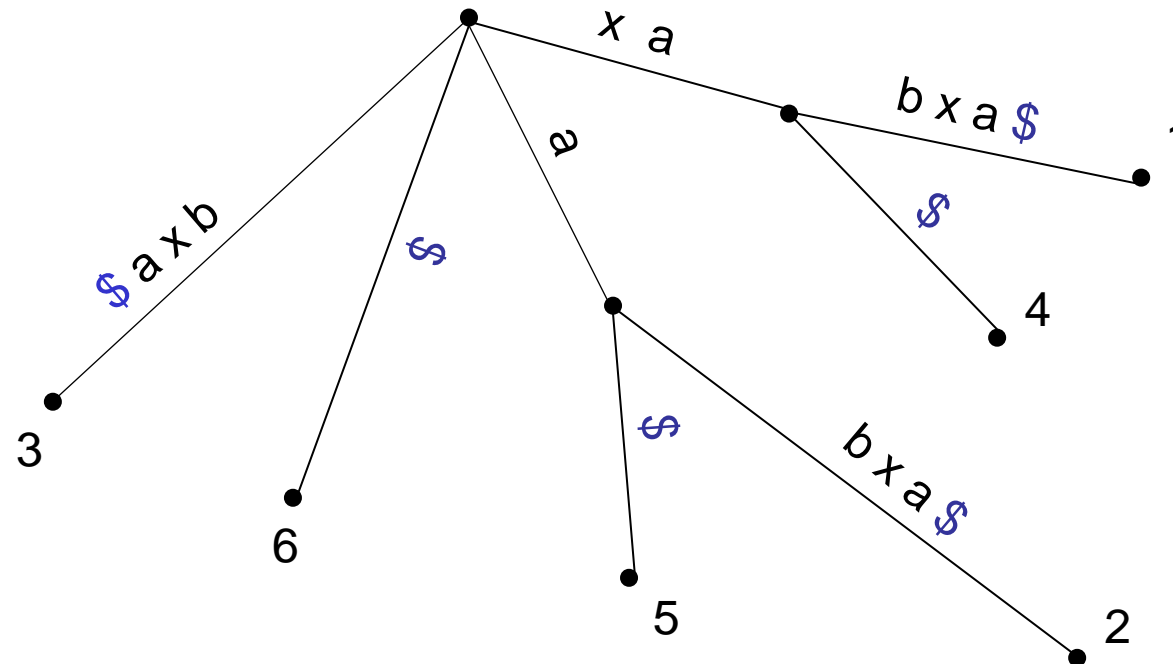


Definition: An *implicit suffix tree* is a tree obtained from the suffix tree for $t\$$ by

- (1) deleting every copy of $\$$ from the edge labels,
- (2) deleting edges that have no label,
- (3) deleting unary nodes.

Ukkonen's algorithm: implicit suffix trees

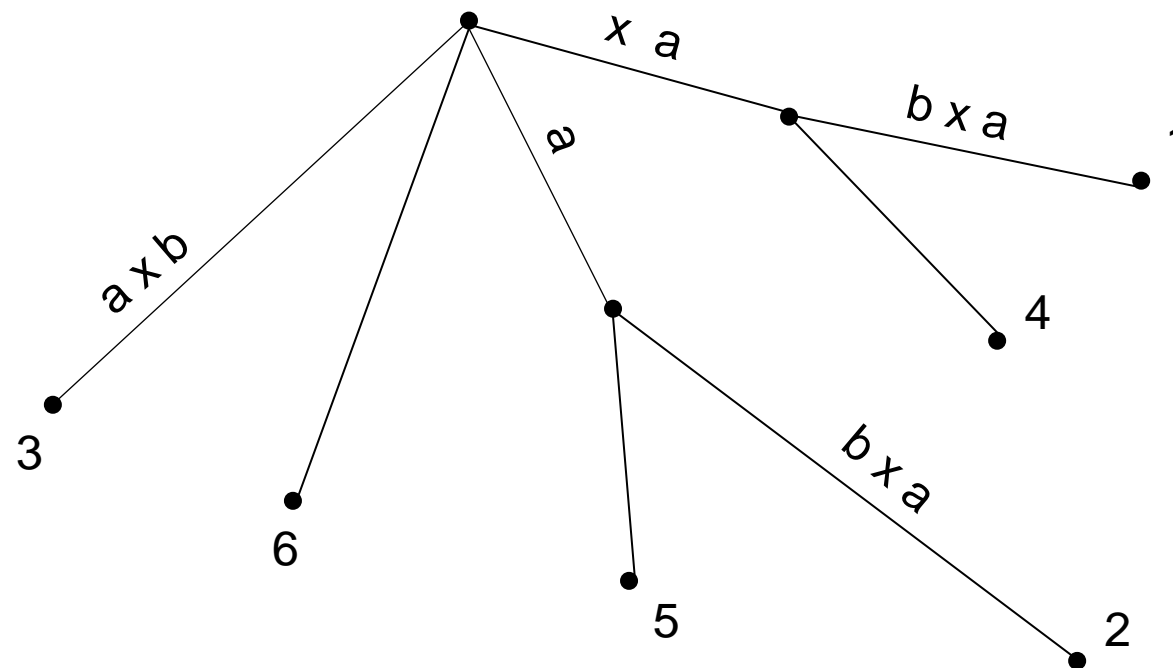
$t = x a b x a \$$
 1 2 3 4 5 6



Ukkonen's algorithm: implicit suffix trees



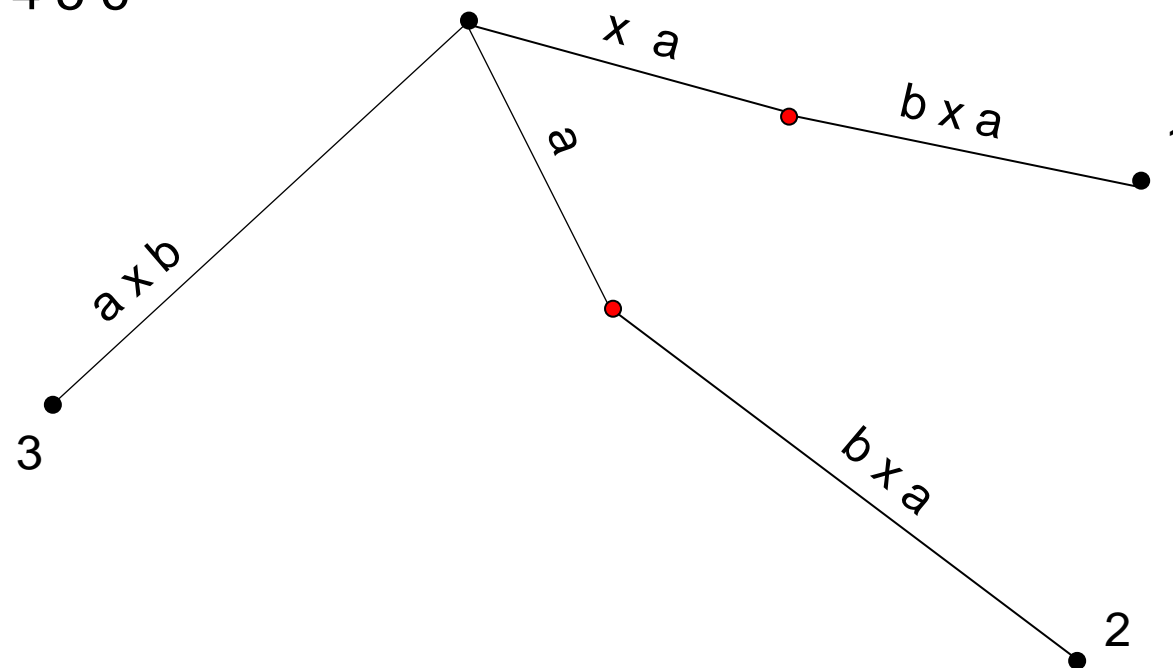
(1) deleting \$ from the edge labels



Ukkonen's algorithm: implicit suffix trees

(2) deleting edges that have no label

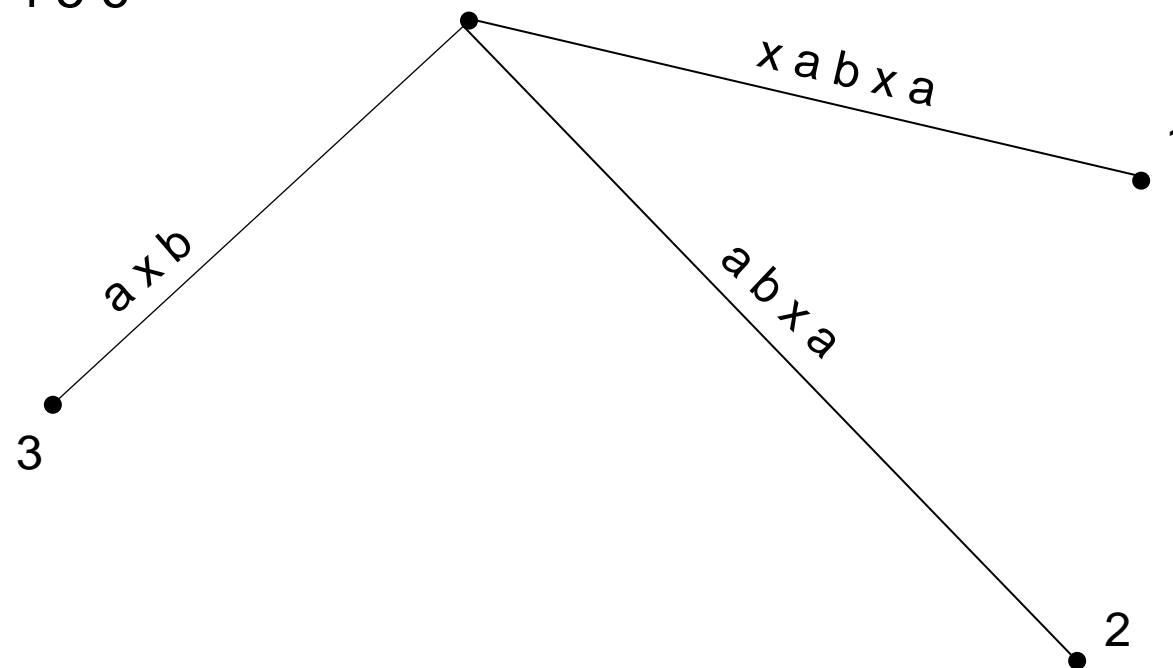
$t = x a b x a \$$
1 2 3 4 5 6



Ukkonen's algorithm: implicit suffix trees

(3) deleting unary nodes

$t = x a b x a \$$
1 2 3 4 5 6



Ukkonen's algorithm

Let $t = t_1 t_2 t_3 \dots t_m$.

Ukk is an **online** algorithm: The suffix tree $ST(t)$ is constructed step by step by constructing a sequence of implicit suffix trees for the prefixes of t :

$ST(\varepsilon), ST(t_1), ST(t_1 t_2), \dots, ST(t_1 t_2 \dots t_m)$

$ST(\varepsilon)$ is the empty implicit suffix tree, consisting of the root only.

Ukkonen's algorithm

This is an *online* approach in the sense that in each step, the implicit suffix tree for a prefix of t is created without knowledge of the rest of the input string t .

Since the algorithm reads the input string character by character from left to right, it works *incrementally*.

Ukkonen's algorithm

Incremental construction of an implicit suffix tree:

Induction basis: $ST(\varepsilon)$ consists of the root only.

Induction step: $ST(t_1 \dots t_i)$ is extended to $ST(t_1 \dots t_i t_{i+1})$ for all $i < m$.

Let T_i be the implicit suffix tree for $t[1 \dots i]$.

- At first, we construct T_1 : This tree has a single edge labeled with character t_1 .
- In **phase $i+1$** , we construct tree T_{i+1} from T_i .
- We iterate for $i = 1 \dots m-1$.

Ukkonen's algorithm

Pseudo code for **Ukk**:

Construct tree T_1 .

for $i = 1$ **to** $m-1$ **do**

begin {**phase** $i+1$ }

for $j = 1$ **to** $i+1$ **do**

begin {**extension** j }

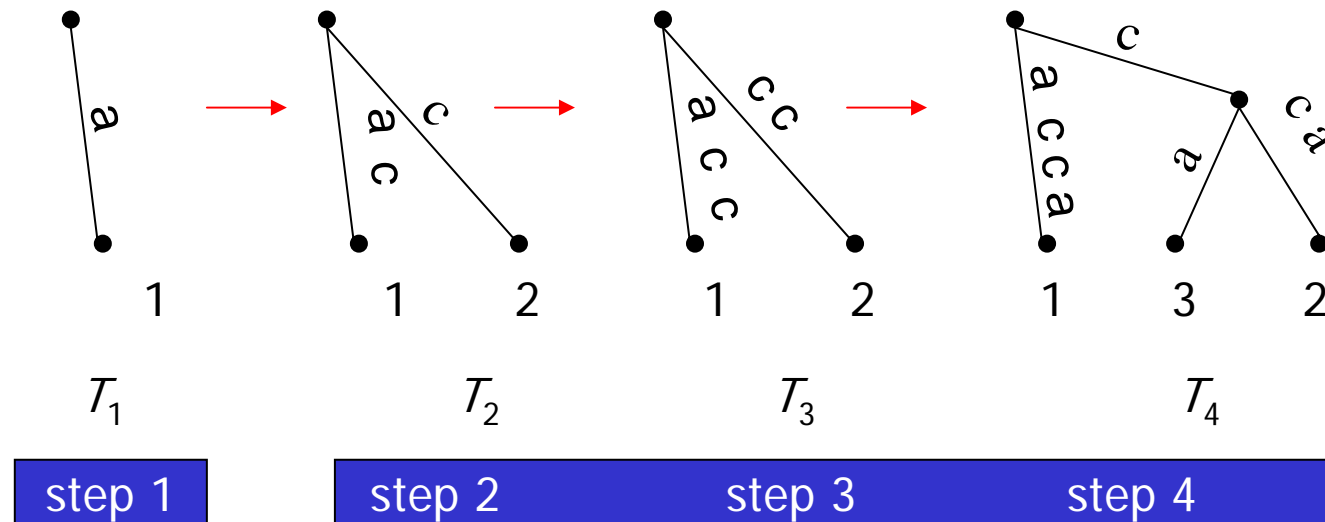
In the current tree find the end of the path from the root labeled $t[j \dots i]$. If necessary, extend that path by adding character $t[i+1]$, thus ensuring that string $t[j \dots i+1]$ is in the tree.

end;

end;

Ukkonen's algorithm

$t = acca\$$



Ukkonen's algorithm

- In extension j of phase $i+1$, the **end** of the path from the root labeled with substring $t[j\dots i]$ is determined. Then, this substring is extended by adding the character $t[i+1]$ to its end (unless $t[i+1]$ already appears there).
- In phase $i+1$, string $t[1\dots i+1]$ is first inserted into the tree, followed by strings $t[2\dots i+1]$, $t[3\dots i+1]$, (in extensions 1,2,3,....., respectively).
- Extension $i+1$ of phase $i+1$ inserts the single character string $t[i+1]$ into the tree (unless it is already there).

Ukk: Suffix extension rules

Extension j (in phase $i+1$) results from applying one of the following rules:

Rule 1: If the path $t[j\dots i]$ ends at a leaf, character $t[i+1]$ is added to the end of the label on that leaf edge.

Rule 2: If no path from the end of string $t[j\dots i]$ starts with character $t[i+1]$, then a new leaf edge labeled with character $t[i+1]$ is created. A new internal node will also be created there if $t[j\dots i]$ ends inside an edge.
(This is the only extension that increases the number of leaves!
The new leaf represents the suffix starting at position j .)

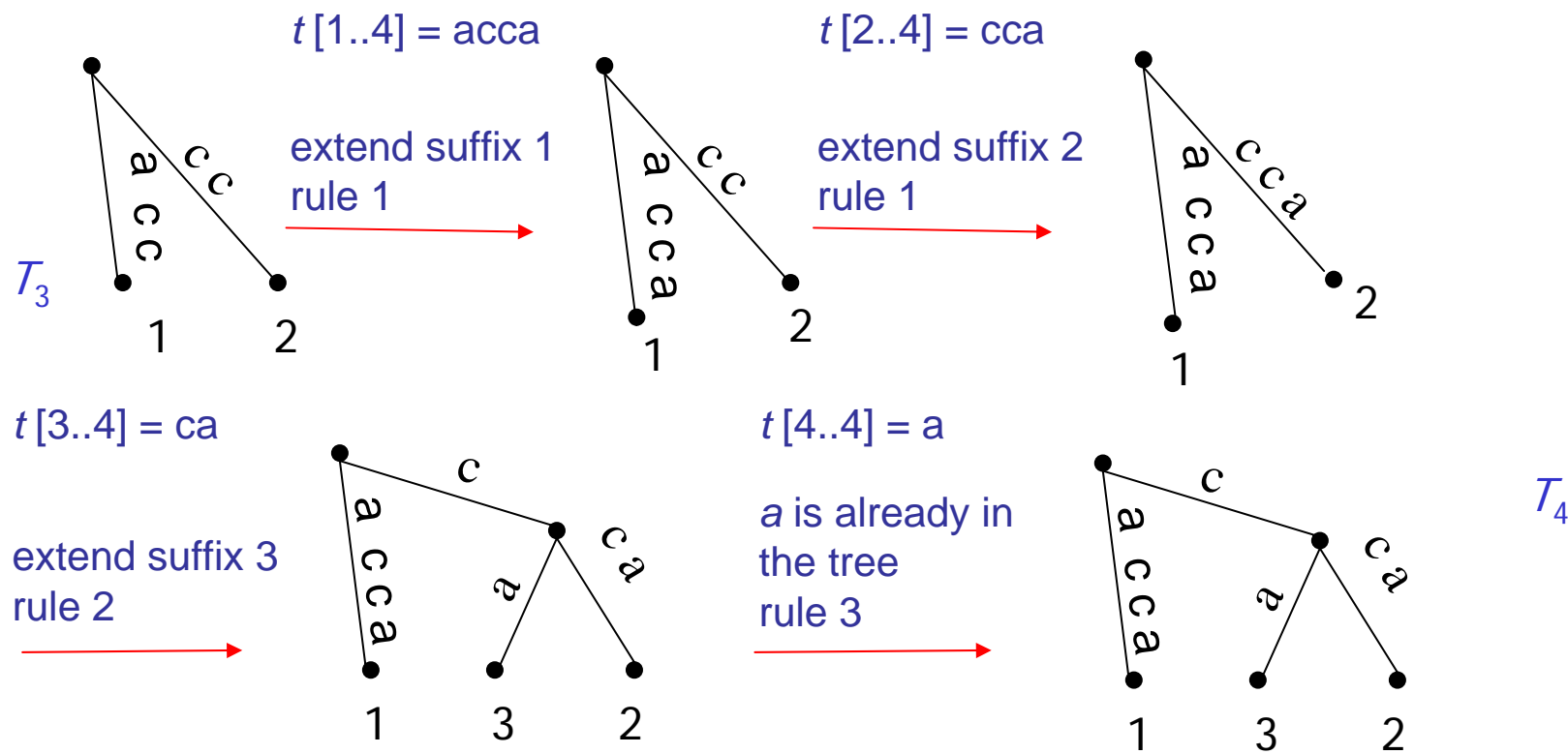
Rule 3: If some path from the end of string $t[j\dots i]$ starts with character $t[i+1]$, then string $t[j\dots i+1]$ is already in the current tree, so we do nothing.

Ukkonen's algorithm

$t = a c c a \$$

$t[1..3] = acc$

$t[1..4] = acca$



Ukkonen's algorithm

During phase $i+1$ (when T_{i+1} is constructed from T_i) the following holds:

- (1) If rule 3 applies in extension j , then the path labeled $t[j\dots i]$ in T_i must continue with character $t[i+1]$. So, any path labeled $t[j'\dots i]$ for $j' \geq j$ also continues with character $t[i+1]$.

Therefore, rule 3 again applies in extensions $j' = j+1, \dots, i+1$.

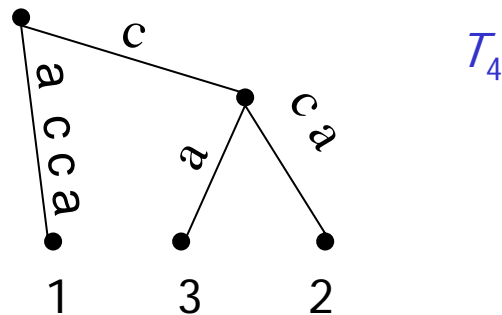
Once rule 3 applies in an extension of phase $i+1$, this phase may be ended.

Ukkonen's algorithm

- (2) If a leaf is created in T_i , then it will remain a leaf in all successive trees $T_{i'}$ for $i' > i$ (once a leaf, always a leaf!).

Reason: A leaf edge is never extended beyond its current leaf.

$t = a c c a b a a c b a \dots$



Ukkonen's algorithm

Implication:

- Leaf 1 is created in phase 1. In each phase $i+1$ there is an initial sequence of successive extensions (starting with extension 1) where rule 1 or 2 applies.
- Let j_i denote the last extension in this sequence of phase i .
Then: $j_i \leq j_{i+1}$

Ukkonen's algorithm



Extensions according to rule 1 may be performed implicitly!

Ukkonen's algorithm

Improving the algorithm:

In phase $i+1$, rule 1 applies in all extensions j for $j \in [1, j_i]$.

Only constant time is required to do those extensions **implicitly**.

If $j \in [j_i + 1, i+1]$, then find the end of the path labeled $t[j \dots i]$ and extend it by character $t[i+1]$ according to rules 2 or 3.

If rule 3 applies, set $j_{i+1} = j - 1$ and end phase $i+1$.

Ukkonen's algorithm

Example:

phase 1:	compute extensions	1 ... j_1
phase 2:	compute extensions	$j_1 + 1$... j_2
phase 3:	compute extensions	$j_2 + 1$... j_3
....		
phase $i-1$:	compute extensions	$j_{i-2} + 1$... j_{i-1}
phase i :	compute extensions	$j_{i-1} + 1$... j_i

Ukkonen's algorithm

- As long as explicit extensions are performed, keep track of the index j^* of the current **explicit** extension.
- During the execution of the algorithm, j^* never decreases.
- As there are only m phases (where $m = |t|$) and j^* is bounded by m , the algorithm performs only m explicit extensions.

Ukkonen's algorithm

Extended pseudo code for Ukk:

```
Construct tree  $T_1$ ;  $j_1 = 1$ ;  
for  $i = 1$  to  $m - 1$  do  
  begin {phase  $i+1$ }  
    Do all implicit extensions.  
    for  $j = j_i + 1$  to  $i + 1$  do  
      begin {extension  $j$ }  
        In the current tree find the end of the path from the root labeled  
         $t[j \dots i]$ . If necessary, extend that path by adding character  
         $t[i+1]$ , thus ensuring that string  $t[j \dots i+1]$  is in the tree.  
         $j_{i+1} := j$ ;  
        if rule 3 was applied then  $j_{i+1} := j - 1$  and phase  $i+1$  ends;  
      end;  
    end;  
end;
```

Ukkonen's algorithm

$t = \text{pucupcupu}$

$i:$	0	1	2	3	4	5	6	7	8	9
	<u>ε</u>	<u>$*p$</u>	pu	puc	pucu	pucup	pucupc	pucupcu	pucupcup	pucupcupu
			<u>$*u$</u>	uc	ucu	ucup	ucupc	ucupcu	ucupcup	ucupcupu
				<u>$*c$</u>	<u>cu</u>	cup	cupc	cupcu	cupcup	cupcupu
					u	<u>$*up$</u>	upc	upcu	upcup	upcupu
						p	<u>$*pc$</u>	<u>pcu</u>	<u>pcup</u>	pcupu
							c	cu	cup	*cupu
								u	up	<u>$*upu$</u>
									p	pu
										u

- Suffixes that cause an extension according to rule 2 are marked with *.
- Underlined suffixes indicate the last extension where rule 2 applies.
- Suffixes that end a phase (the first time rule 3 applies) are colored blue.

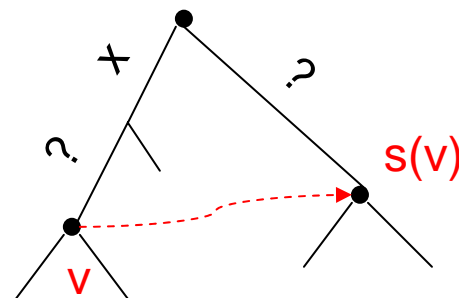
Ukkonen's algorithm

The running time may be improved using suffix links.

Definition: Let $x?$ be an arbitrary string where x is a single character and $?$ some (possibly empty) substring.

For an internal node v with edge labels $x?$ the following holds:

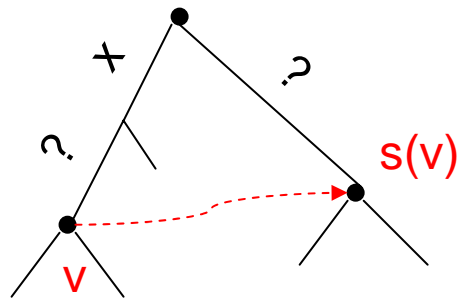
If there exists a node $s(v)$ with edge label $?$, then there is a pointer from v to $s(v)$ which is called a **suffix link**.



Ukkonen's algorithm

Idea:

By following the suffix links, we do not have to start each search for a split point at the root node. Instead, we can use the suffix links in order to determine these nodes more efficiently, i.e. in constant amortized time.



Ukkonen's algorithm

- Using suffix links, extension rules 2 and 3 can be applied more efficiently.
- Any explicit extension takes amortized $O(1)$ time (not shown here).
- Since there are only m explicit extensions, the total running time of Ukkonen's algorithm is $O(m)$ (where $m = |t|$).

Ukkonen's algorithm



The true suffix tree:

The final implicit suffix tree T_m can be converted to a true suffix tree in $O(m)$ time.

- (1) Add a terminal symbol \$ to the end of t .
- (2) Let Ukkonen's algorithm continue with this character.

The resulting tree is the true suffix tree where no suffix is prefix of another suffix and where each suffix ends at a leaf.