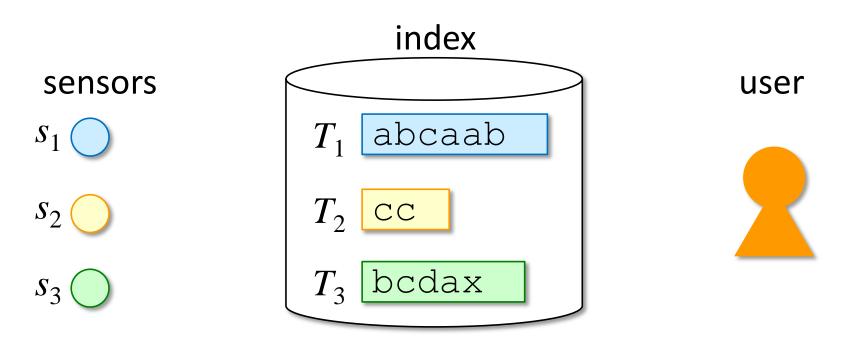
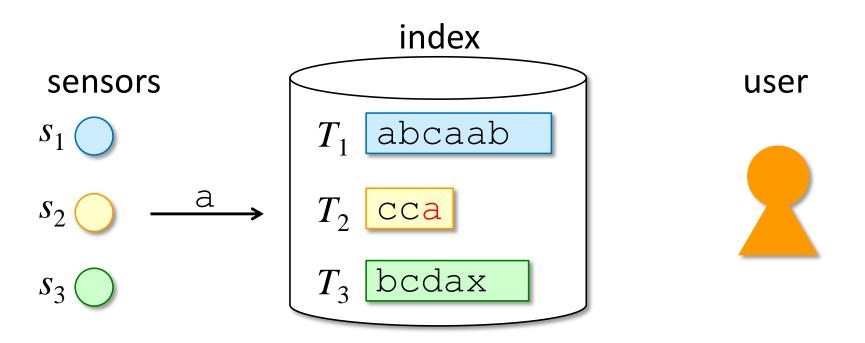
# Fully-online suffix tree and DAWG construction for multiple texts

Shunsuke Inenaga Kyushu University, Japan

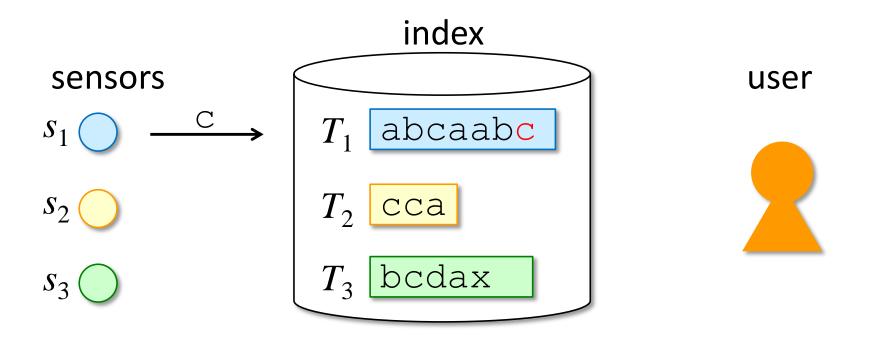
- Goal: Indexing multiple texts in fully-online manner where each text can grow any time.
- Motivation: Indexing multi online/streaming data.
  - Sensing data, trajectory data, twitter, etc.



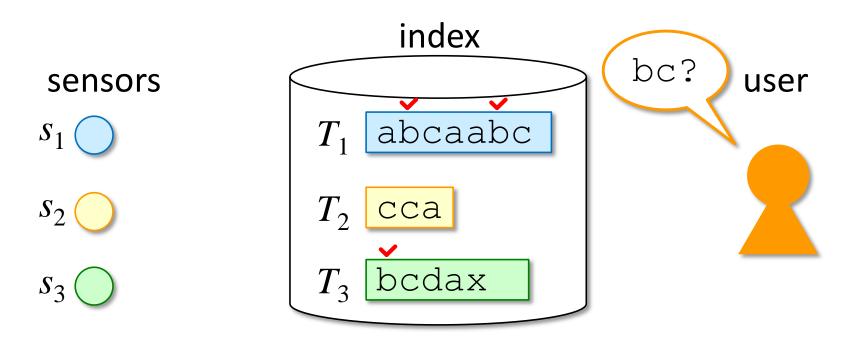
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- Goal: Indexing multiple texts in fully-online manner where each text can grow any time.
- Motivation: Indexing multi online/streaming data.
  - Sensing data, trajectory data, twitter, etc.



... May, 2015

We could extend Ukkonen's algorithm to fully-online multiple texts.



Takuya Takagi



Hiroki Arimura



Me

It's difficult to maintain active points and leaf edge labels for multiple texts...



Takuya Takagi



Hiroki Arimura



Me

What about Weiner's algorithm?



Takuya Takagi



Hiroki Arimura



Me

Hmm, it seems that Weiner's right-to-left algorithm can be directly extended to fully-online multiple texts...!



Takuya Takagi



Hiroki Arimura



Me

Great!

As a bonus, we could also obtain left-to-right fully-online DAWG construction!



Takuya Takagi



Hiroki Arimura



Me

Also, DAWG can tell us how to maintain active points for Ukkonen's left-to-right suffix tree.



Takuya Takagi



Hiroki Arimura



Me

... July, 2015

Excellent!!

Let's leave maintenance of leaf edge labels as open question and write paper!



Takuya Takagi



Hiroki Arimura



Me

# Our CPM 2016 paper...

## Claim 1

Suffix tree of multiple texts of total length N can be built in *right-to-left* fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

## Claim 2

DAWG (suffix automaton) of multiple texts of total length N can be built in *left-to-right* fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

 $\sigma$  is the alphabet size

# Our CPM 2016 paper...

## Claim 3

Suffix tree of multiple texts of total length N without leaf edge labels can be built in left-to-right fully-online manner in  $O(N \log \sigma)$  time with O(N) space, with the aid of DAWG.

 $\sigma$  is the alphabet size

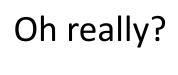
# Danny read our CPM 2016 paper



... January, 2017

Hi, I read your paper, and I am afraid that your results might be wrong...

Danny Breslauer





Takuya Takagi Hiroki Arimura





Me

# Danny read our CPM 2016 paper

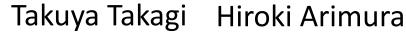


Yes, because you overlooked some operations that can take *super linear* time for fully-online multiple texts.

Danny Breslauer











Me

# Our CPM 2016 paper was WRONG!



## Claim 1

Suffix tree of multiple texts of total length Ncan be built in right-to-left fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

## Claim 2

DAWG (suffix automaton) of multiple texts of total length N can be built in left-to-right fullyonline manner in  $O(N \log \sigma)$  time with O(N) space.

 $\sigma$  is the alphabet size

# Our CPM 2016 paper was WRONG!



## Claim 3

Suffix tree of multiple texts of total length N without leaf edge labels can be built in left-to-right fully-online manner in  $O(N\log\sigma)$  time with O(N) space, with the aid of DAWS.

 $\sigma$  is the alphabet size

All main claims were wrong...



## New team!

... February, 2017

Let's fix the paper!



Takuya Takagi



Hiroki Arimura



Me



**Danny Breslauer** 

# Right-to-left suffix tree



## Claim 1

Suffix tree of multiple texts of total length N can be built in *right-to-left* fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

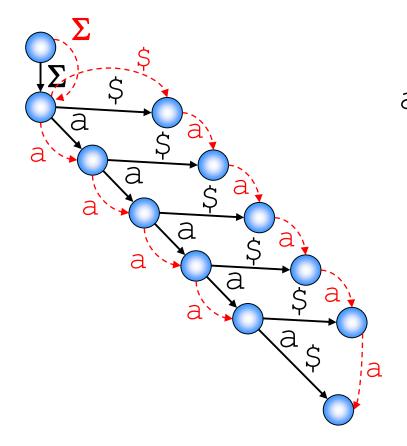
 $\sigma$  is the alphabet size

## Theorem 1

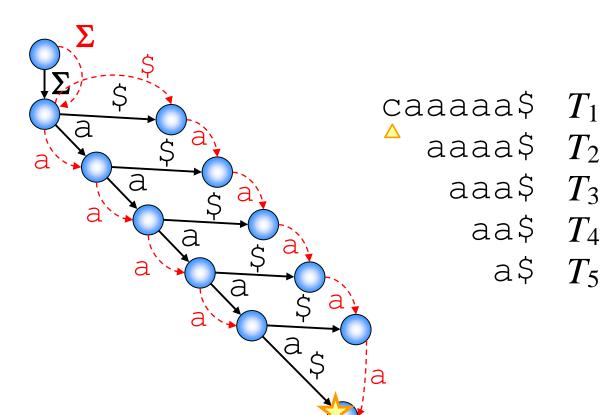
Weiner's right-to-left suffix tree algorithm for fully-online multiple texts needs to visit  $\Omega(N^{1.5})$  nodes, and this bound is tight  $(O(N^{1.5}))$  in the worst case).

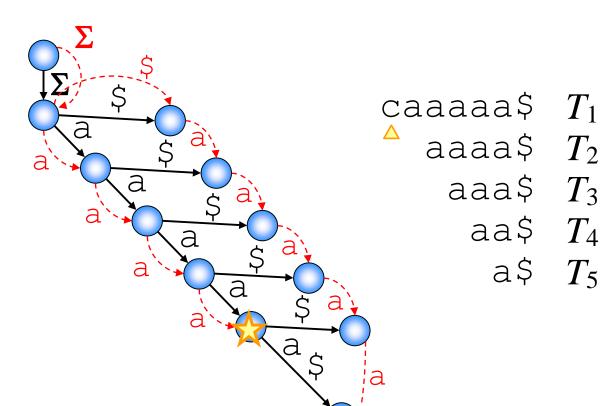
```
aaaaa\$_1 T_1
aaaa\$_2 T_2
aaa\$_3 T_3
aa\$_4 T_4
a\$_5 T_5
```

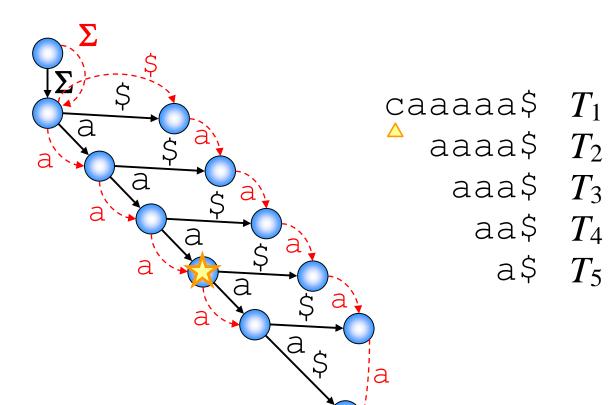
```
aaaaa\$ T_1
aaaaa\$ T_2
aaa\$ T_3
aa\$ T_4
a\$ T_5
```

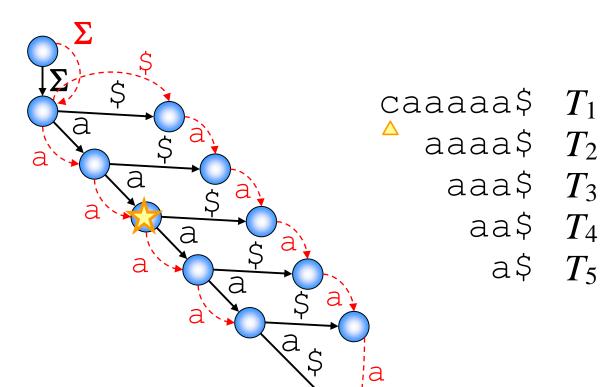


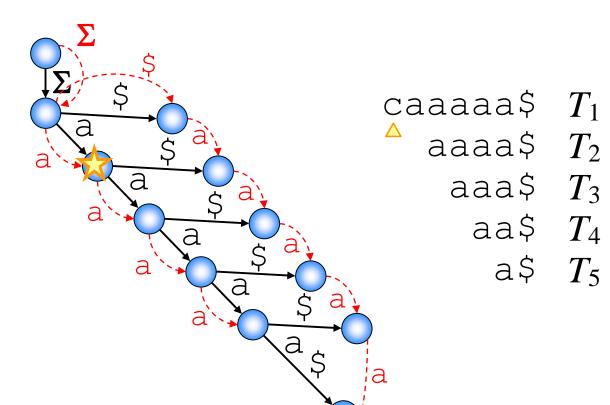
aaaaa\$  $T_1$  aaaa\$  $T_2$  aaa\$  $T_3$  aa\$  $T_4$  a\$  $T_5$ 

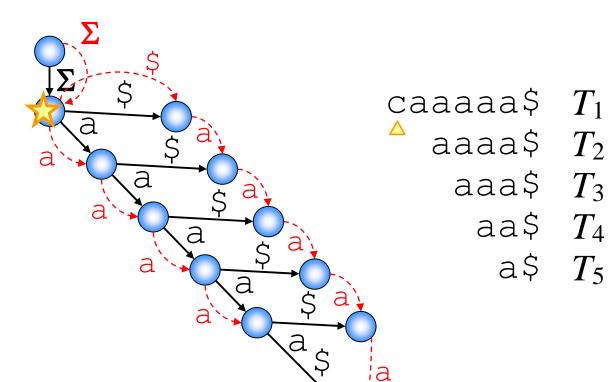


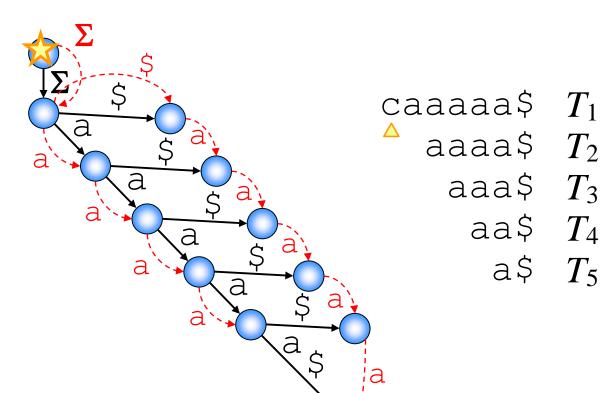


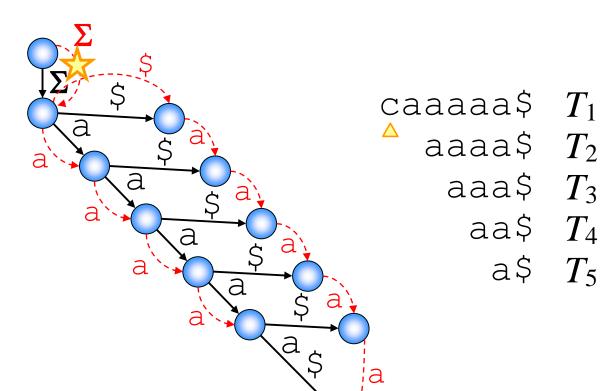


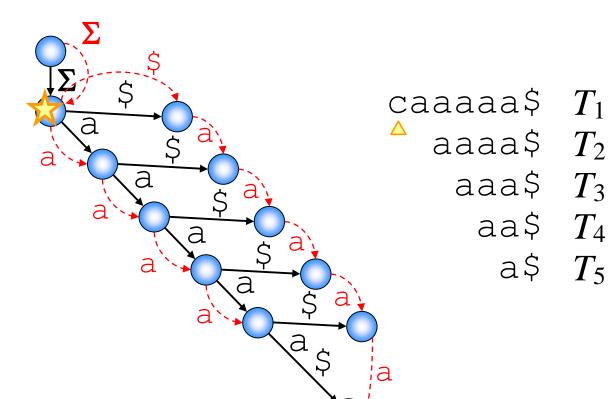


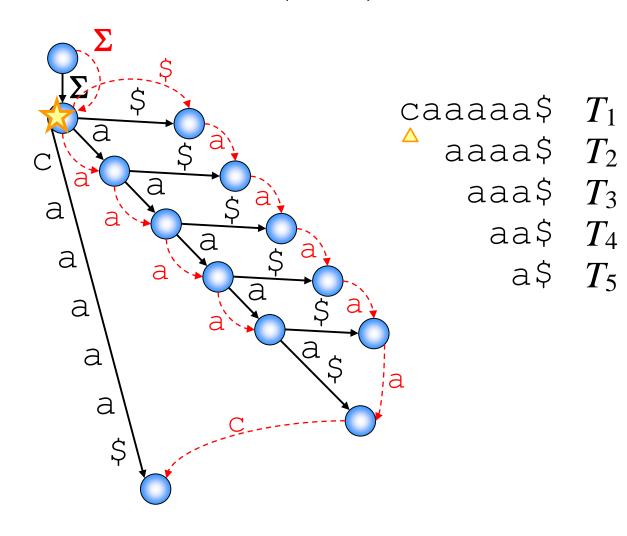


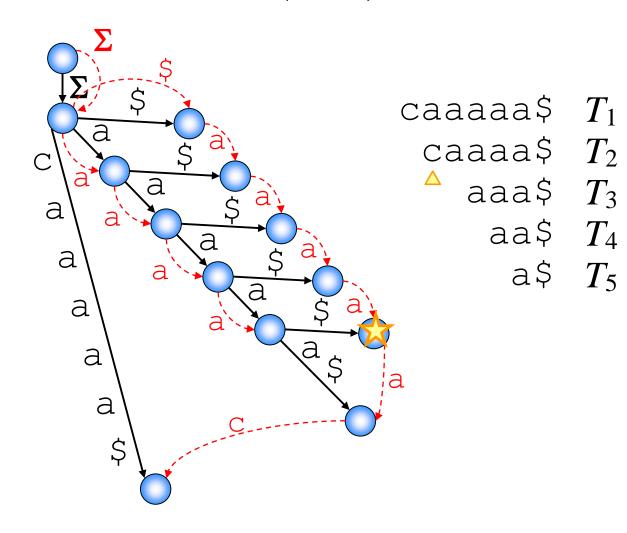


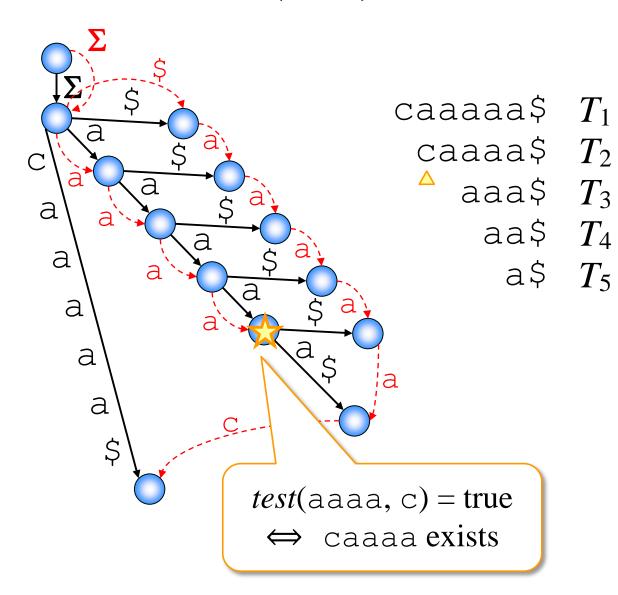


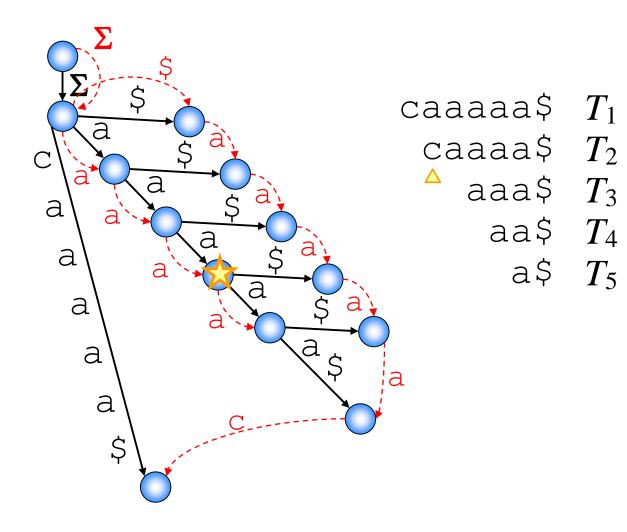


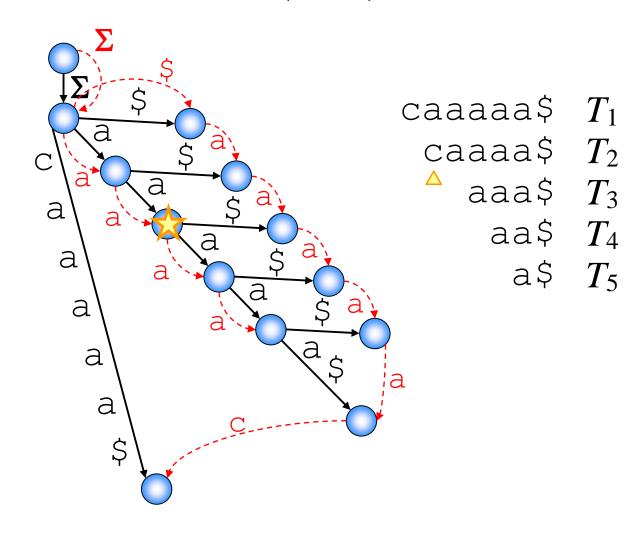


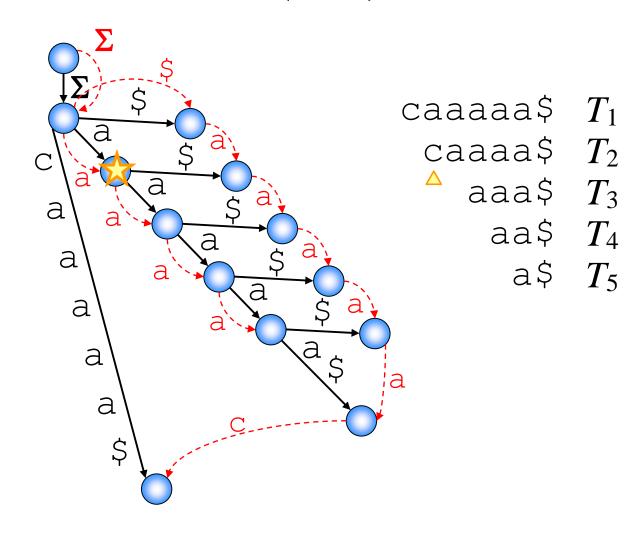


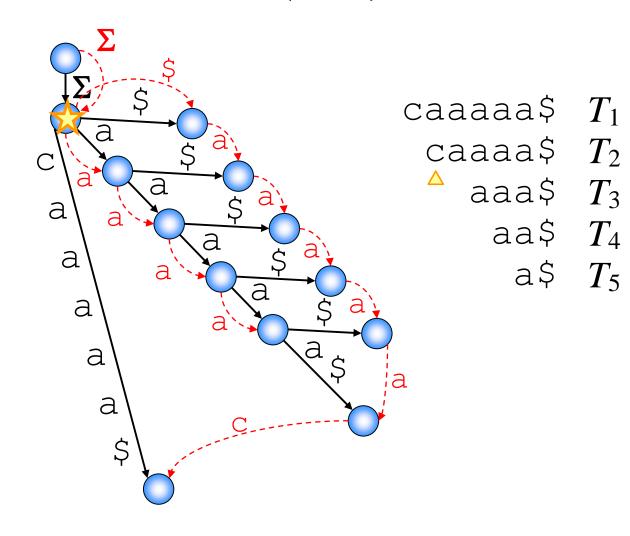


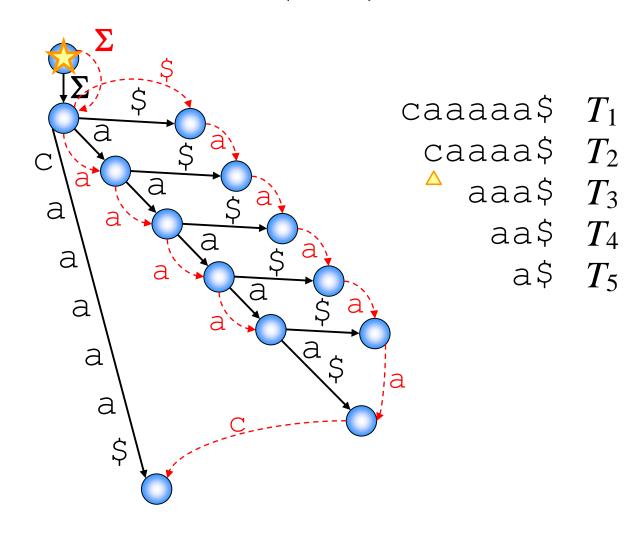


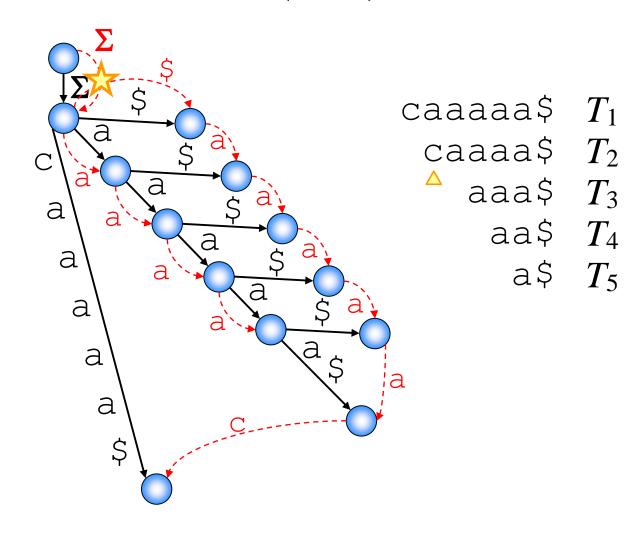


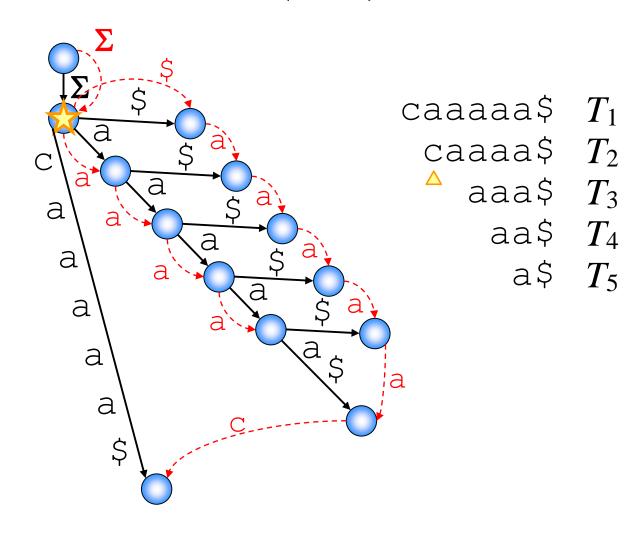


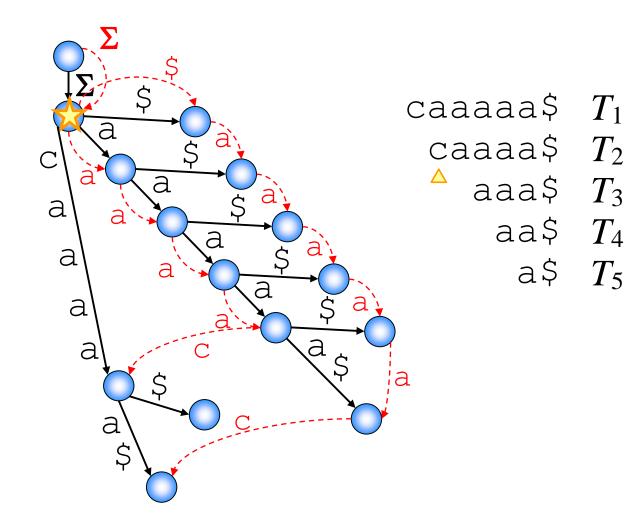


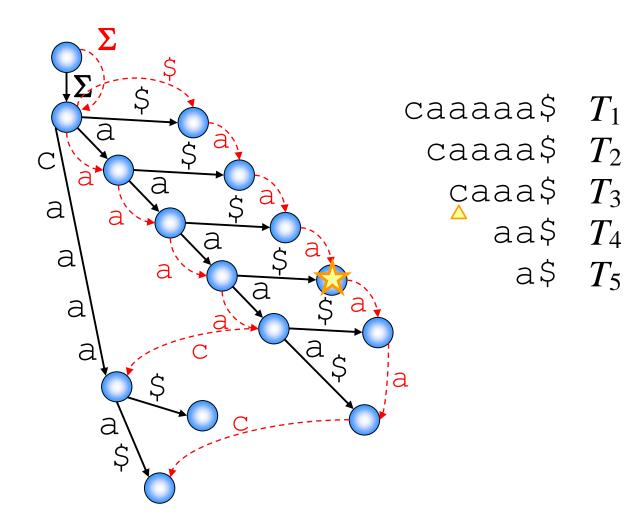


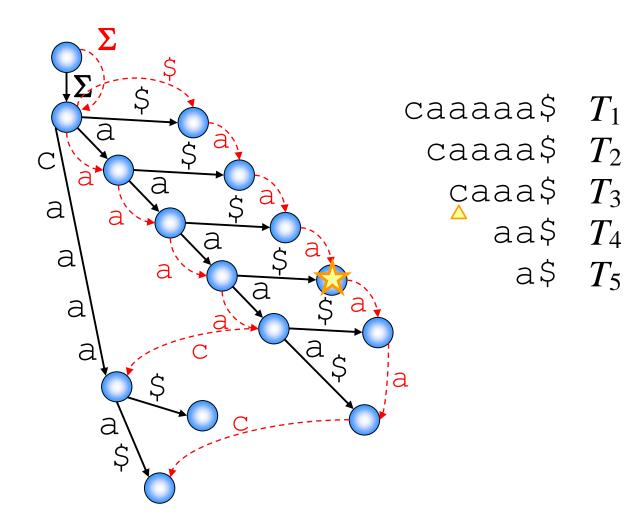


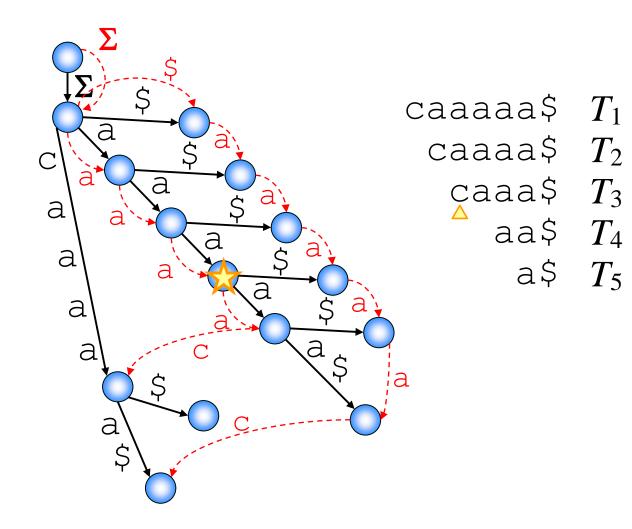


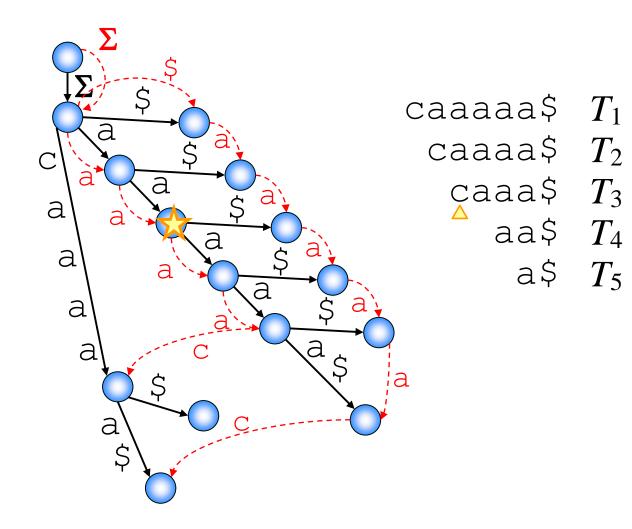


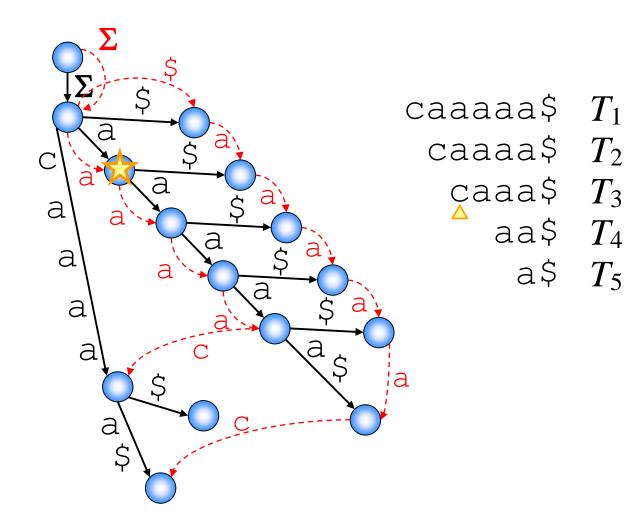


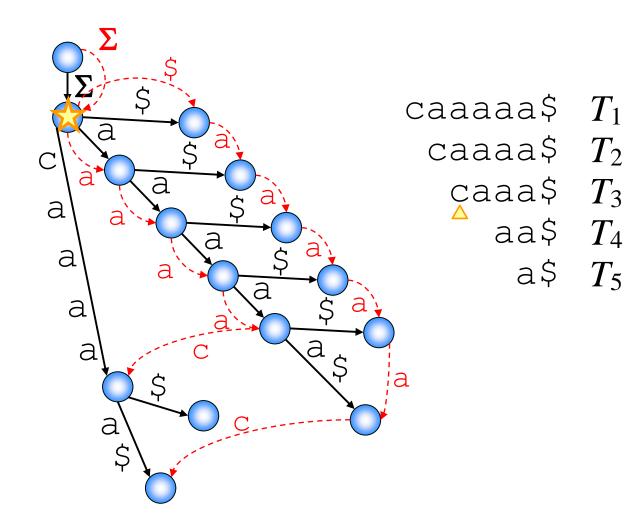


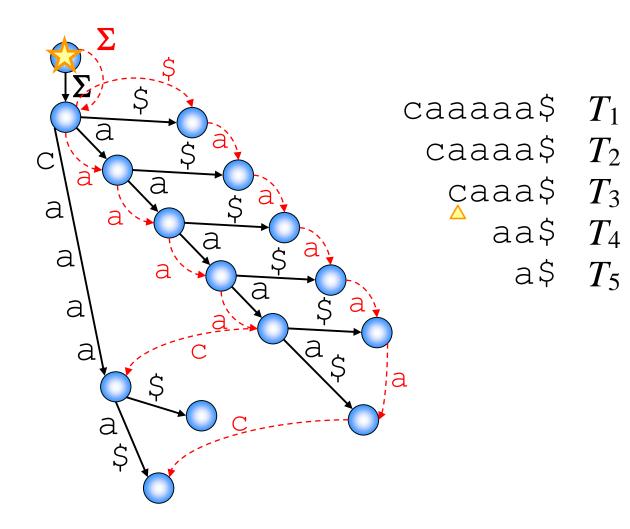


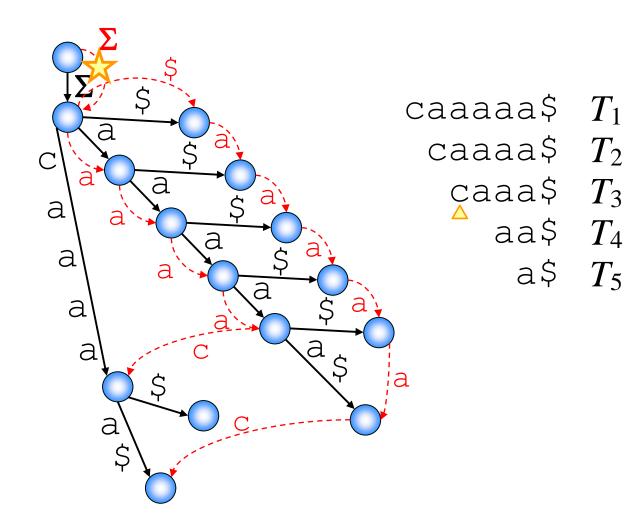


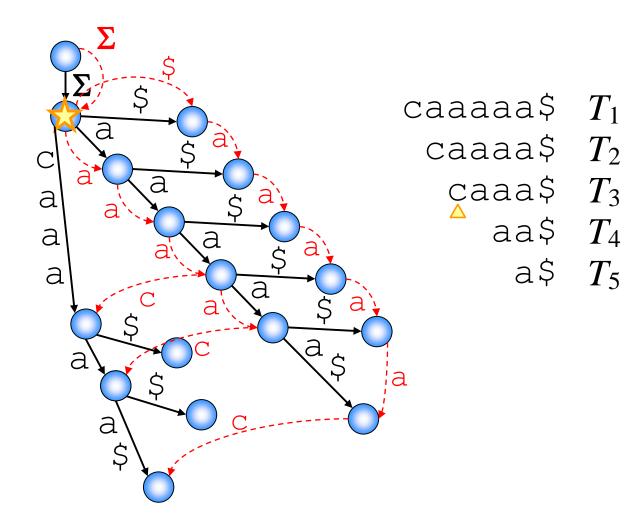


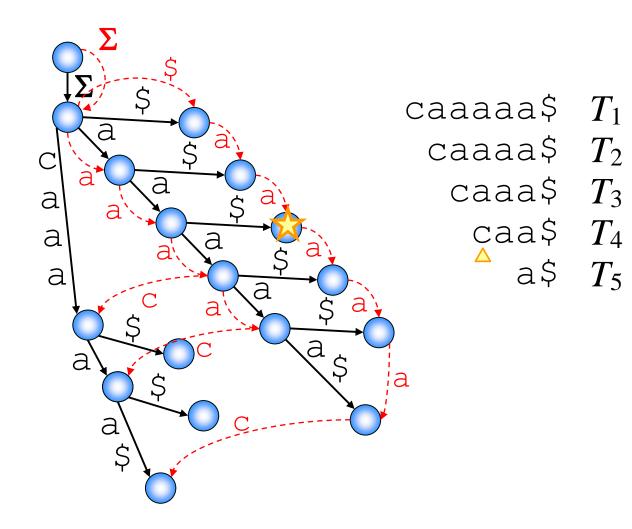


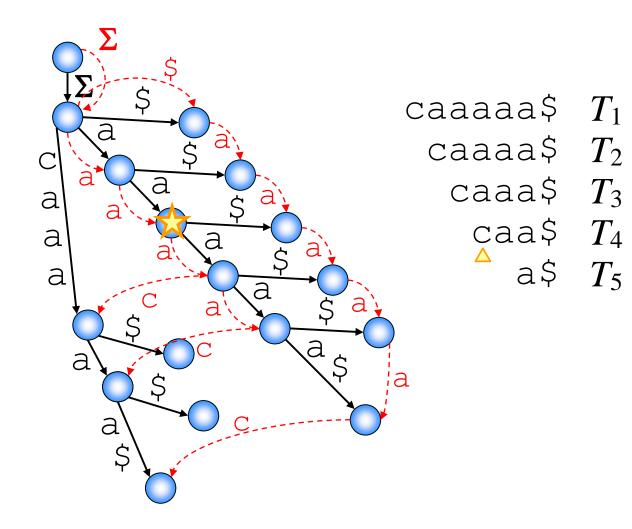


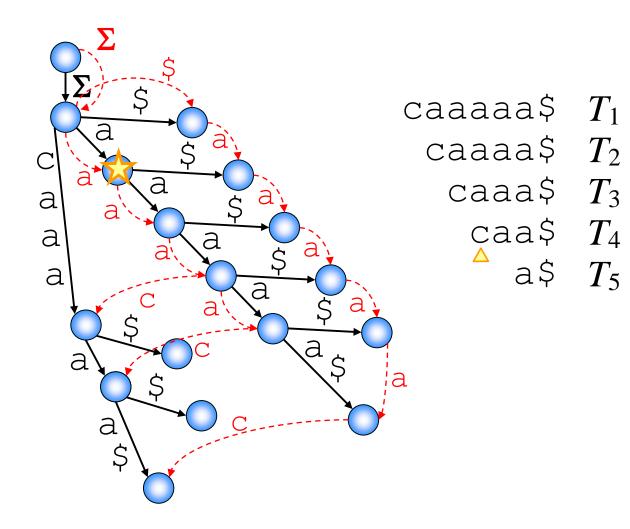


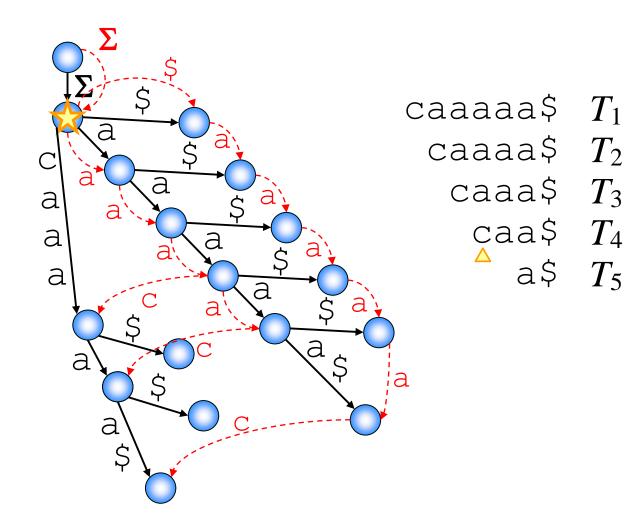


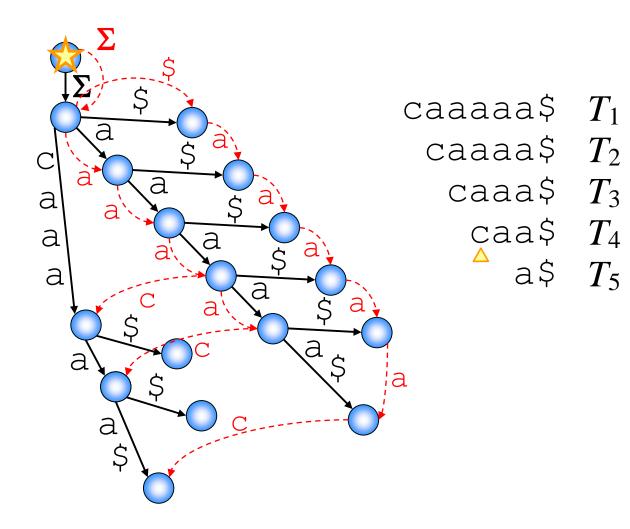


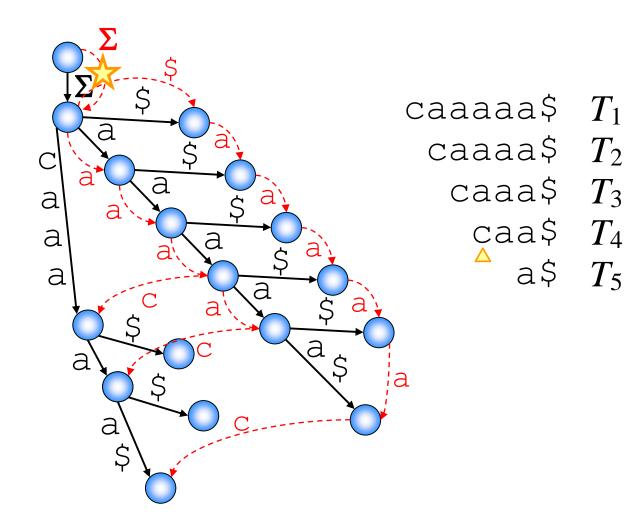


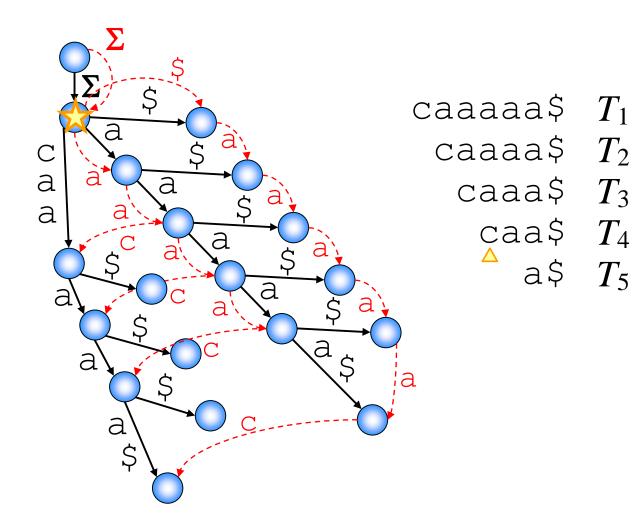


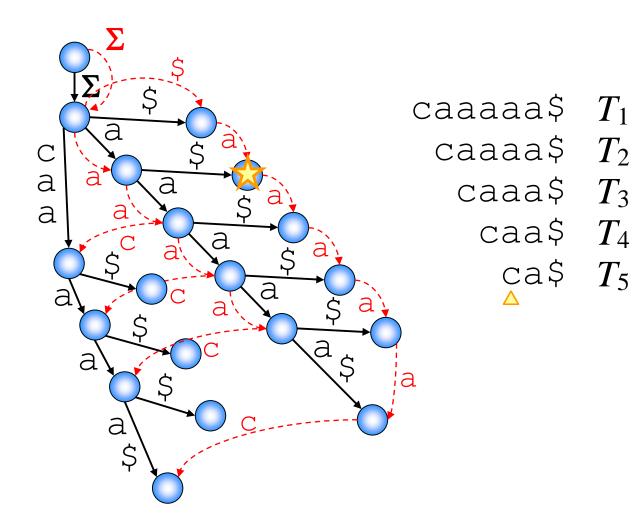


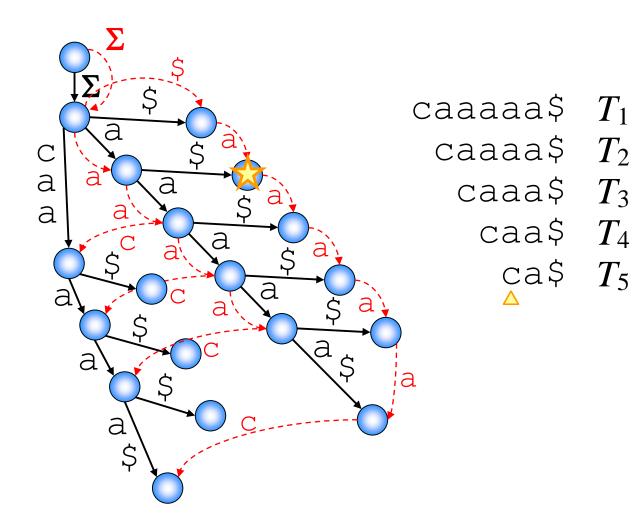


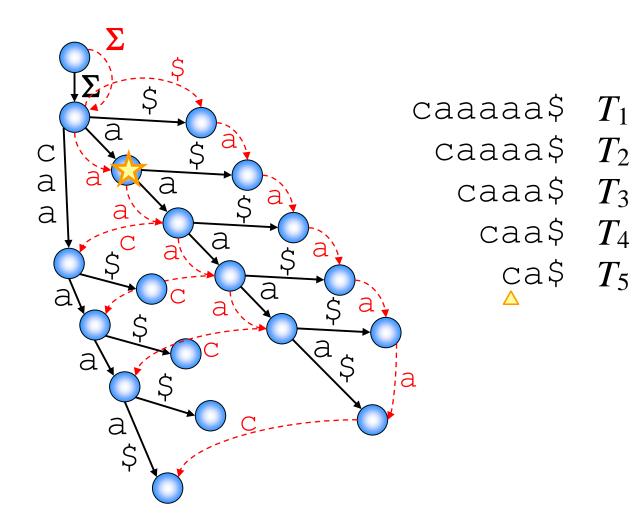


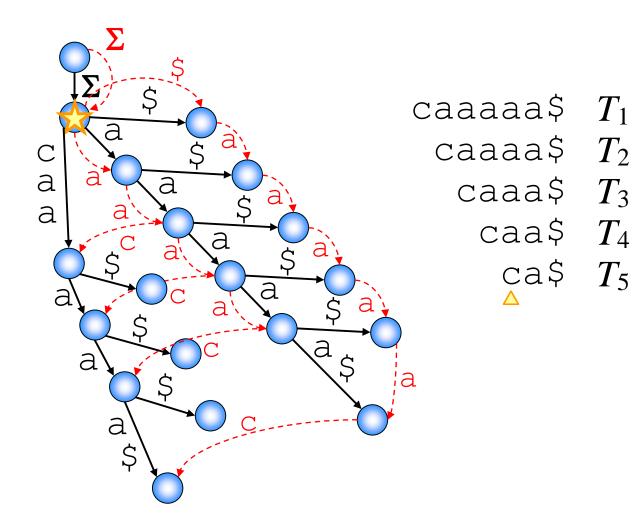


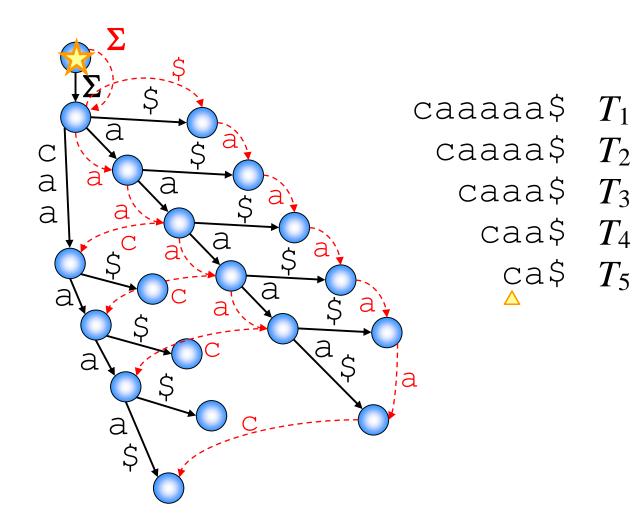


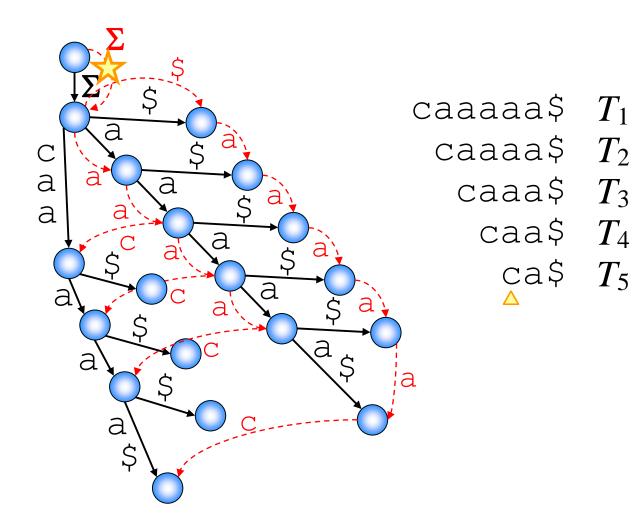


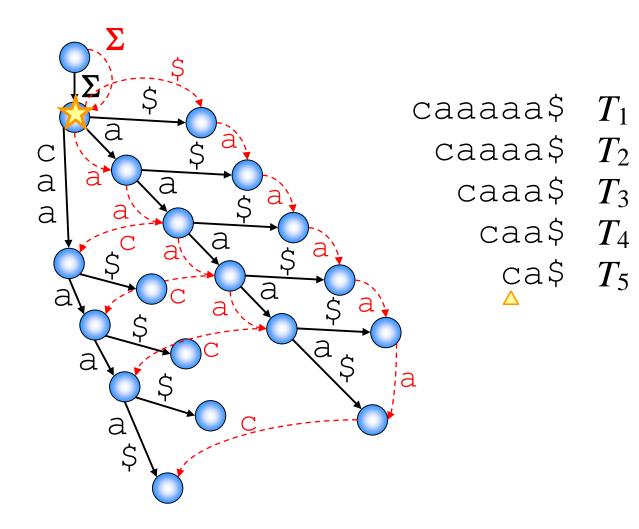


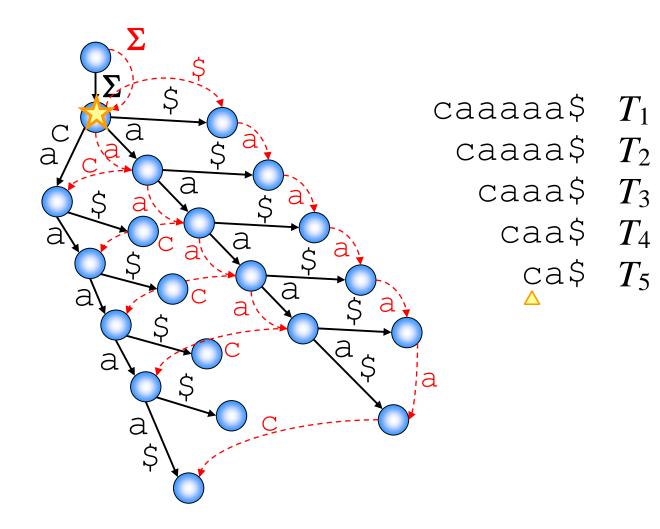


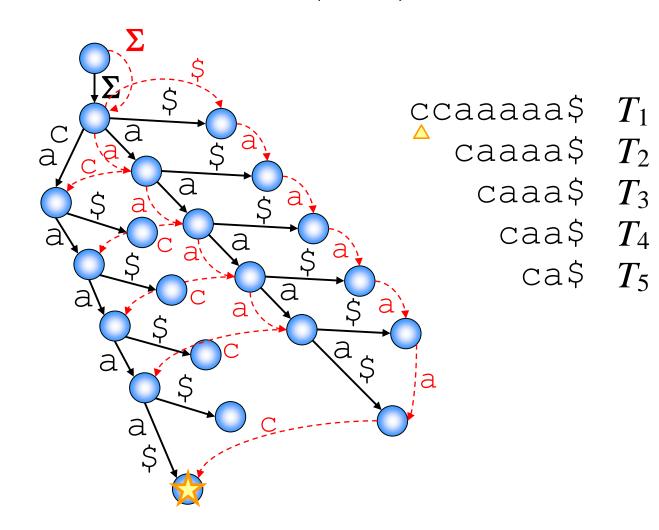


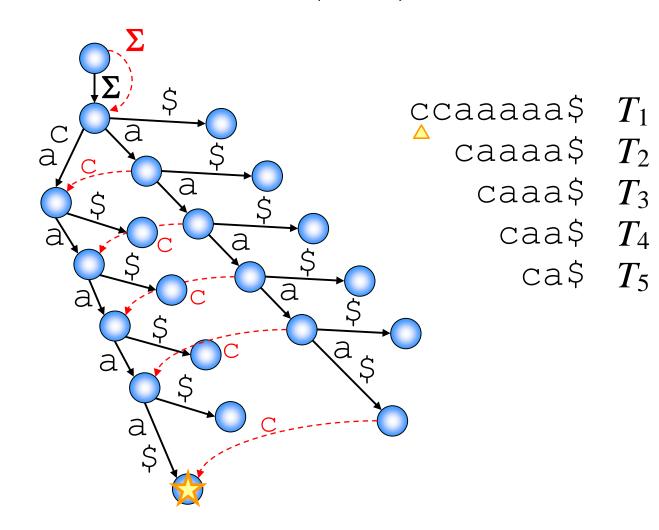


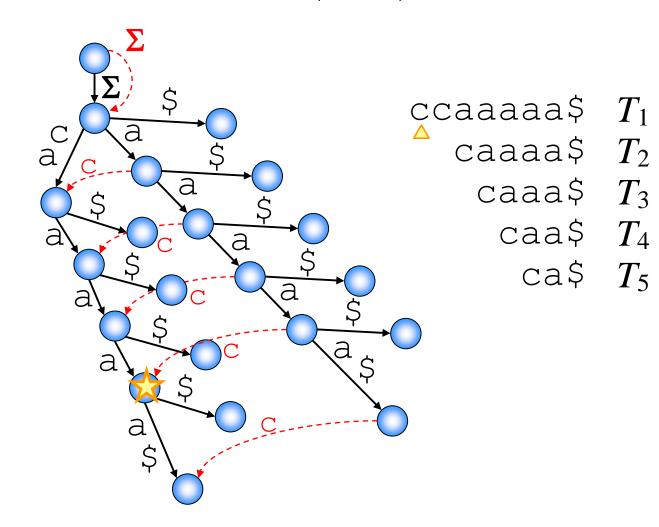


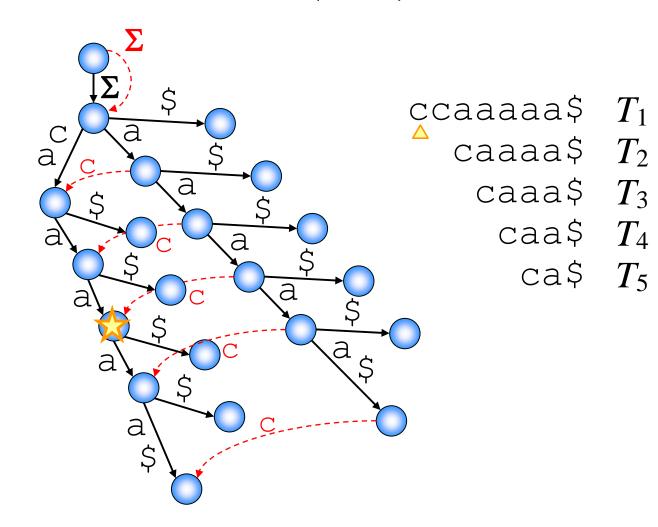


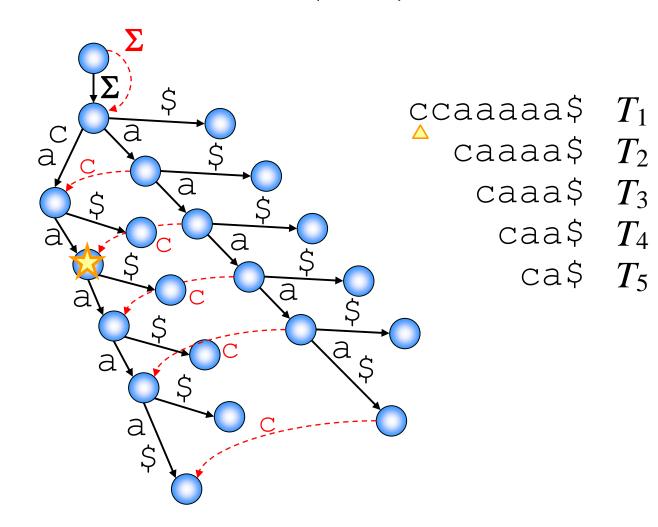


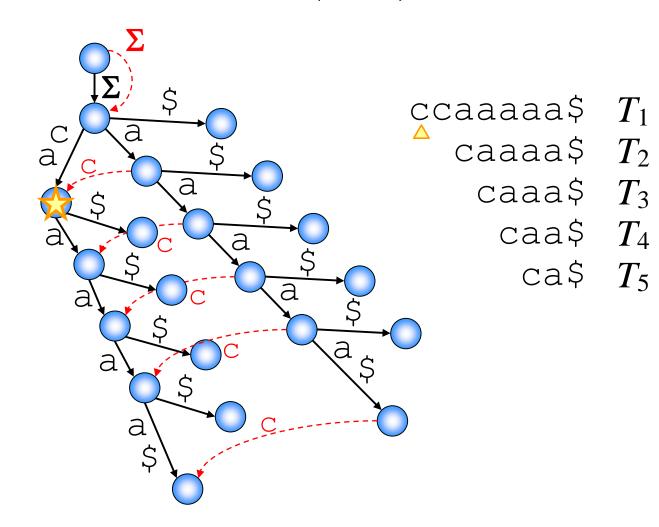


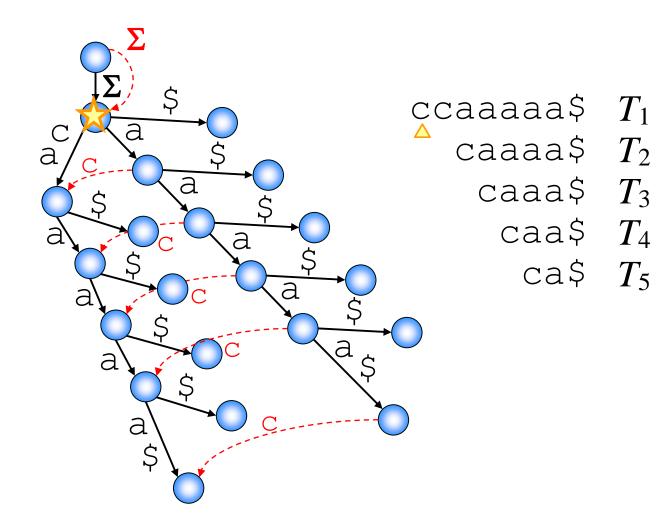


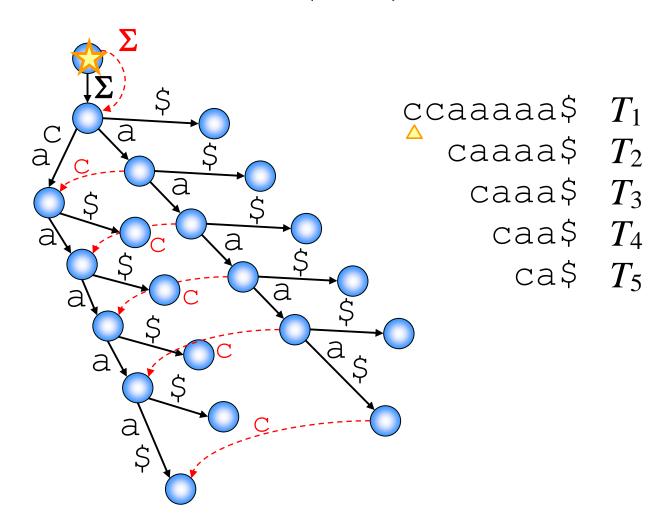


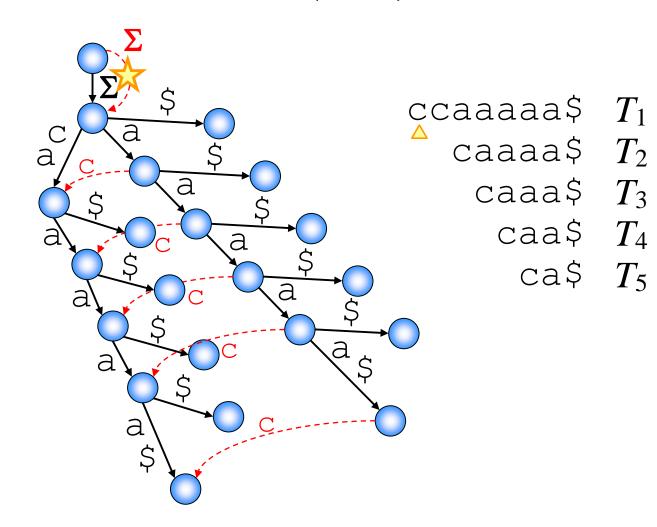


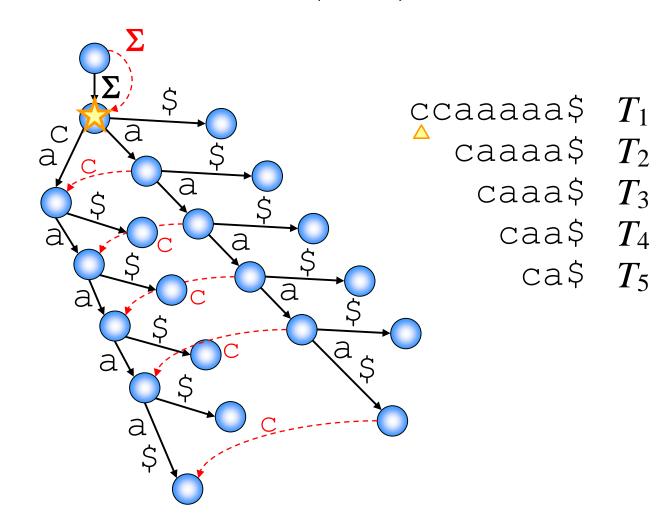


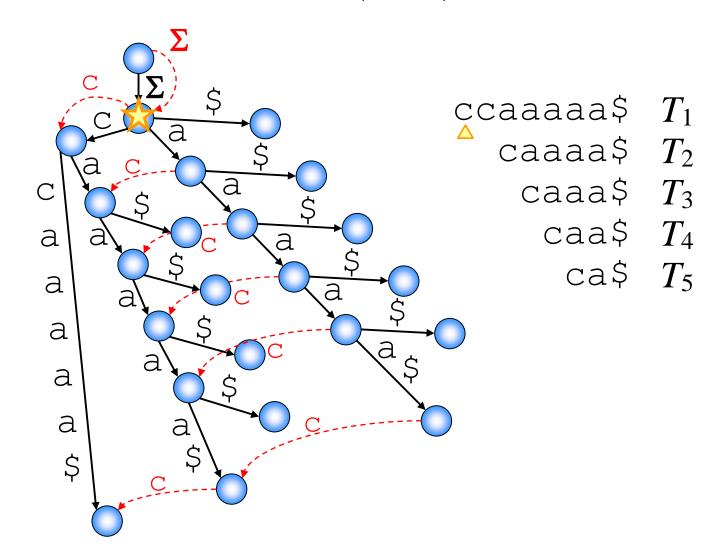


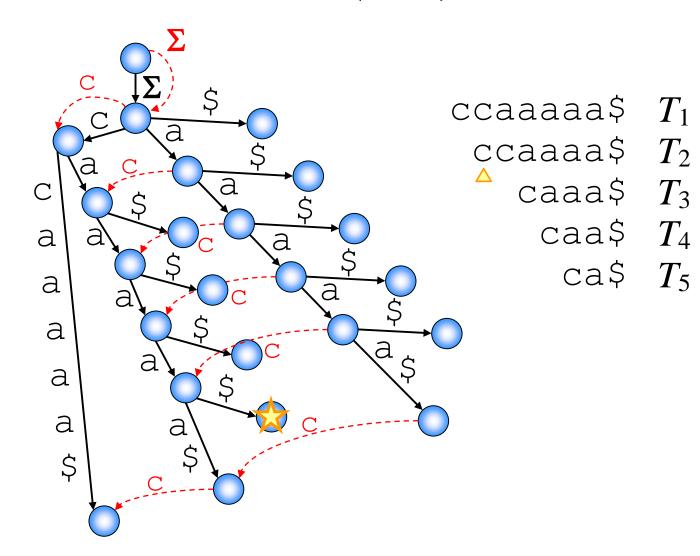


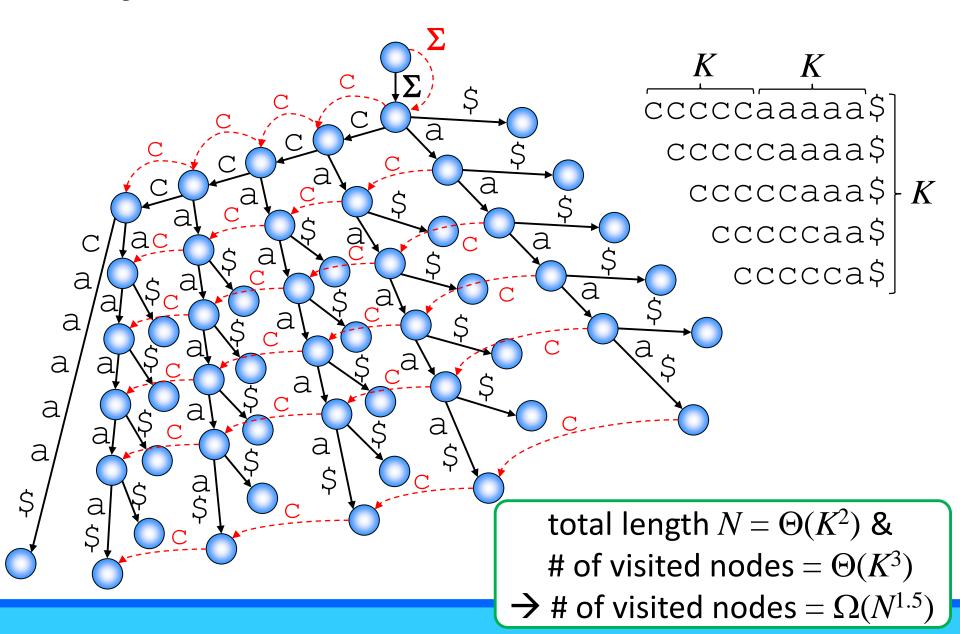












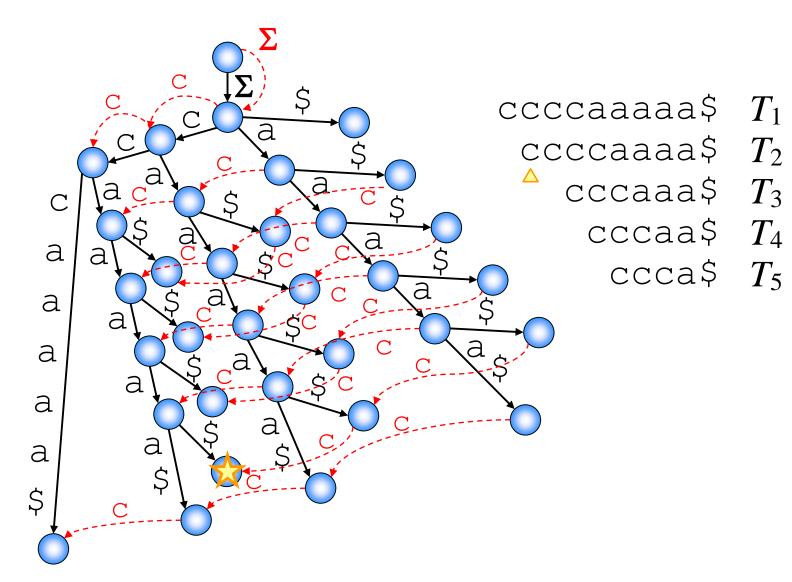
# **Fully-online Weiner**

#### Theorem 1

Weiner's right-to-left suffix tree algorithm for fully-online multiple texts needs to visit  $\Omega(N^{1.5})$  nodes, and this bound is tight  $(O(N^{1.5}))$  in the worst case).

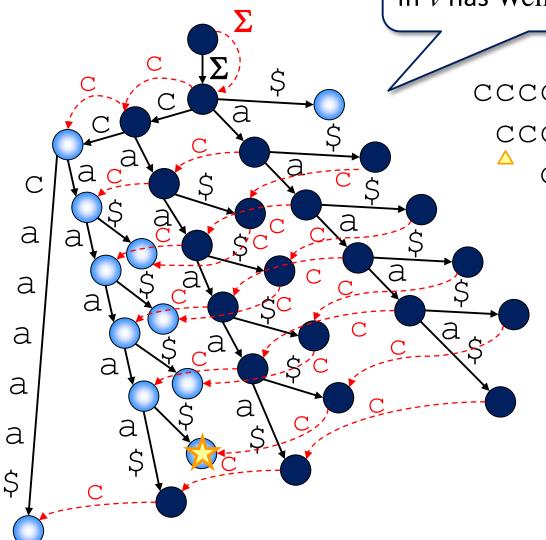
We can do better with non-trivial use of nearest marked ancestor (NMA) data structure!

# Speed-up with NMA



# Speed-up with NMA

Node v is marked  $\bullet$  iff v has Weiner link with  $\circ$ 



ccccaaaaa $\ T_1$ 

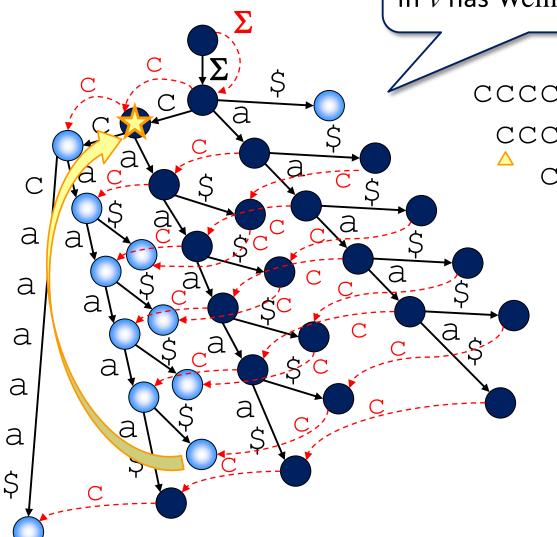
cccaaa $$T_3$ 

cccaa $$T_4$ 

ccca\$  $T_5$ 

# Speed-up with NMA

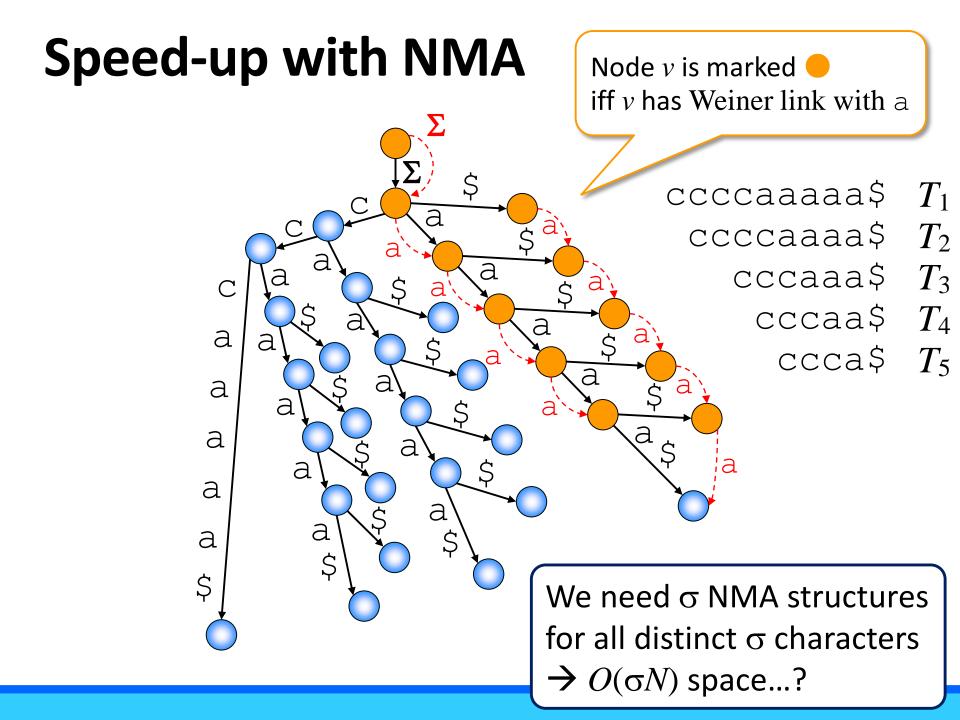
Node v is marked  $\bullet$  iff v has Weiner link with  $\circ$ 

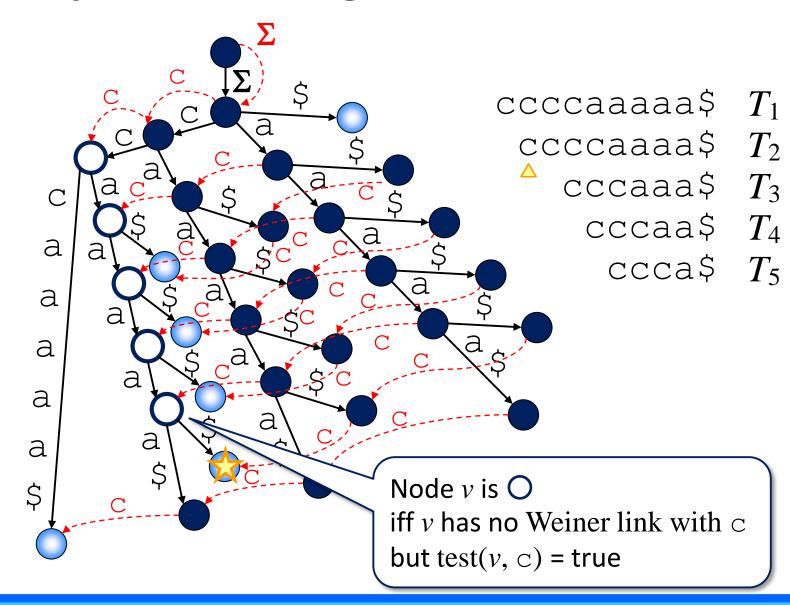


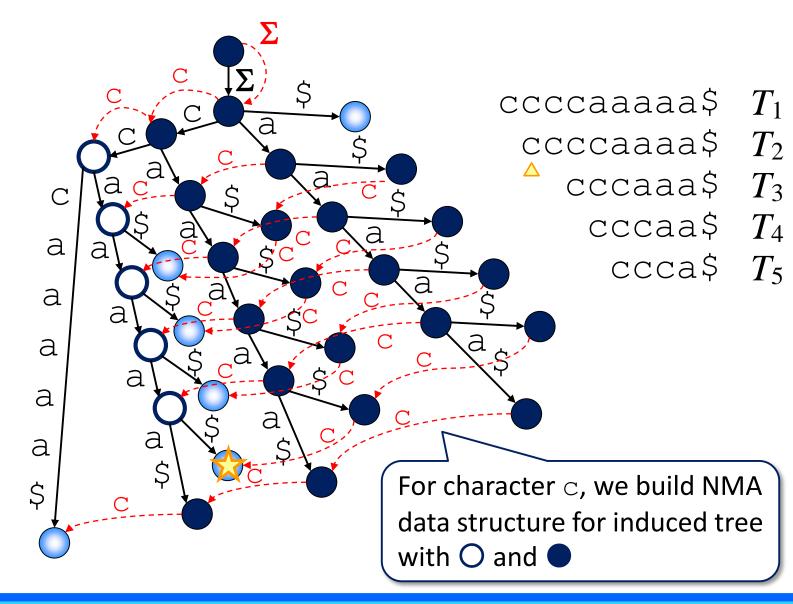
ccccaaaaa $\ T_1$  ccccaaaaa $\ T_2$  cccaaaa $\ T_3$ 

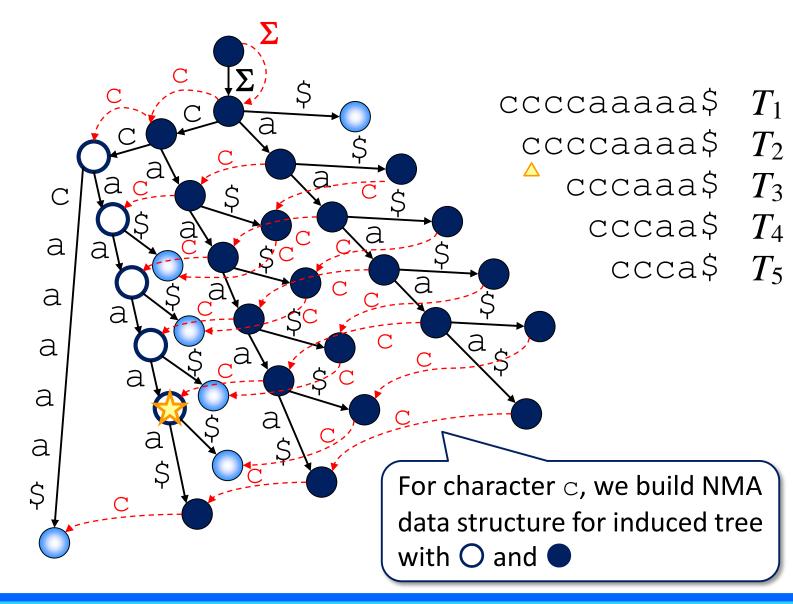
cccaa $$T_4$ 

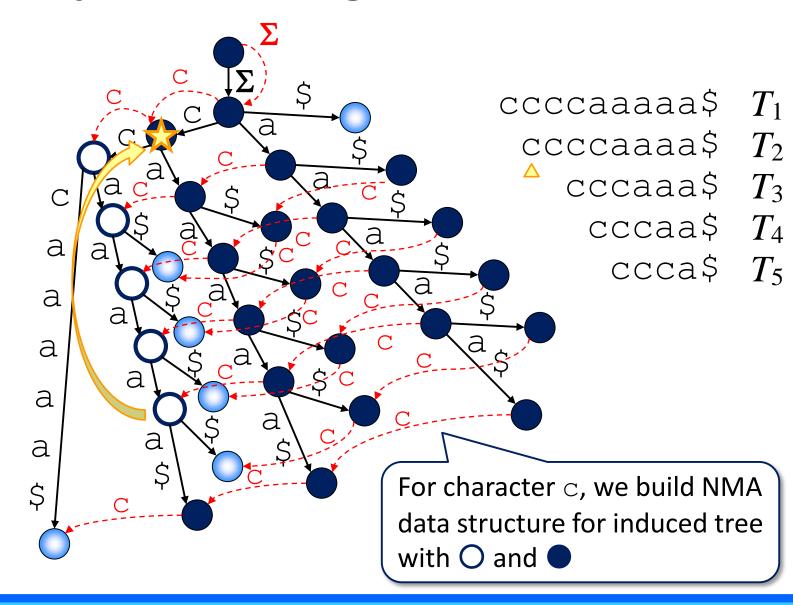
ccca\$  $T_5$ 

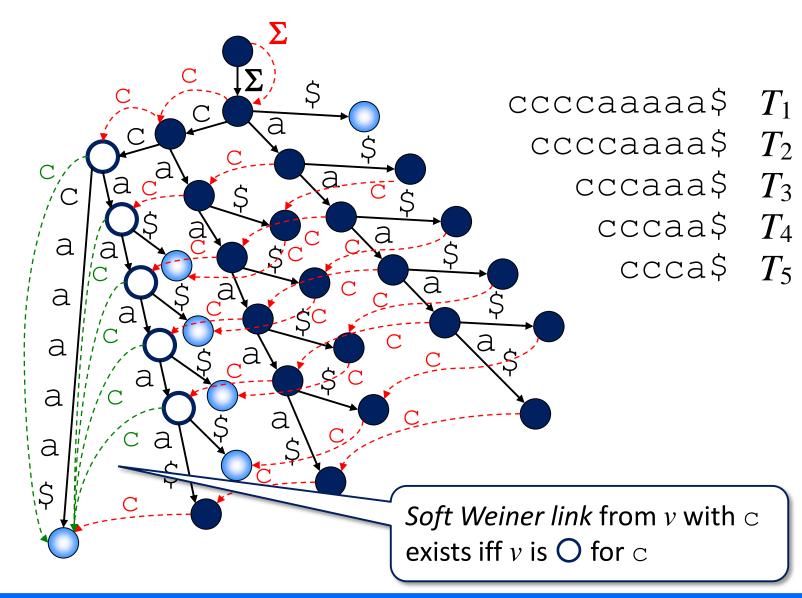












#### Lemma [Blumer et al., 1985 & 1987]

# of hard Weiner links is  $\leq 2N-1$ , and # of soft Weiner links is  $\leq N-1$ .

#### Corollary

Our NMA data structure on top of Weiner's suffix tree requires O(N) space.

### Right-to-left fully-online suffix tree

#### Theorem 1

Weiner's right-to-left suffix tree algorithm for fully-online multiple texts needs to visit  $\Omega(N^{1.5})$  nodes, and this bound is tight  $(O(N^{1.5}))$  in the worst case).

#### Theorem 2

With the aid of NMA, the suffix tree of multiple texts of total length N can be built in *right-to-left* fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

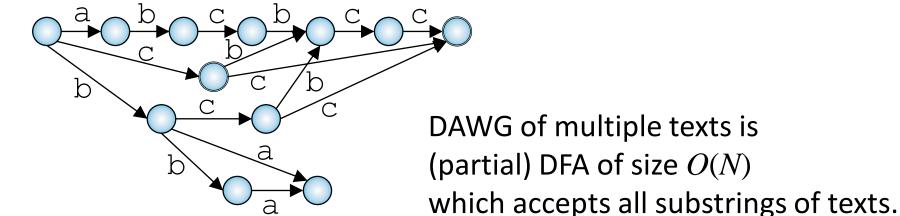
 $\sigma$  is the alphabet size

# **Left-to-right DAWG**

# Claim 2

DAWG (suffix automaton) of multiple texts of total length N can be built in *left-to-right* fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

 $\sigma$  is the alphabet size



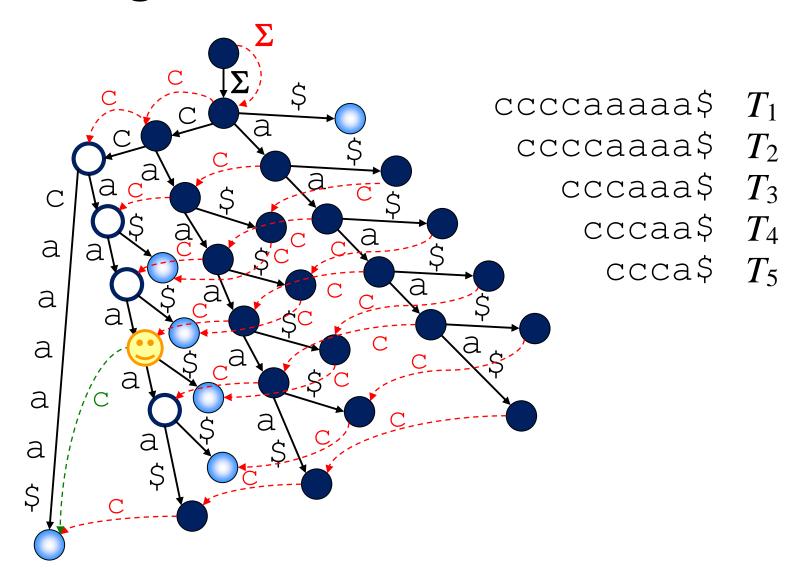
DAWG(abcbcc, bba)

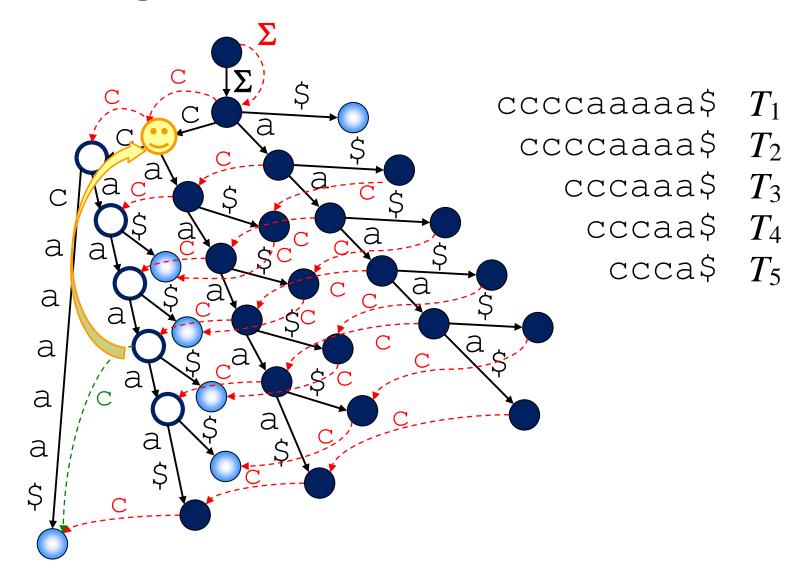
# **Fully-online DAWG construction**

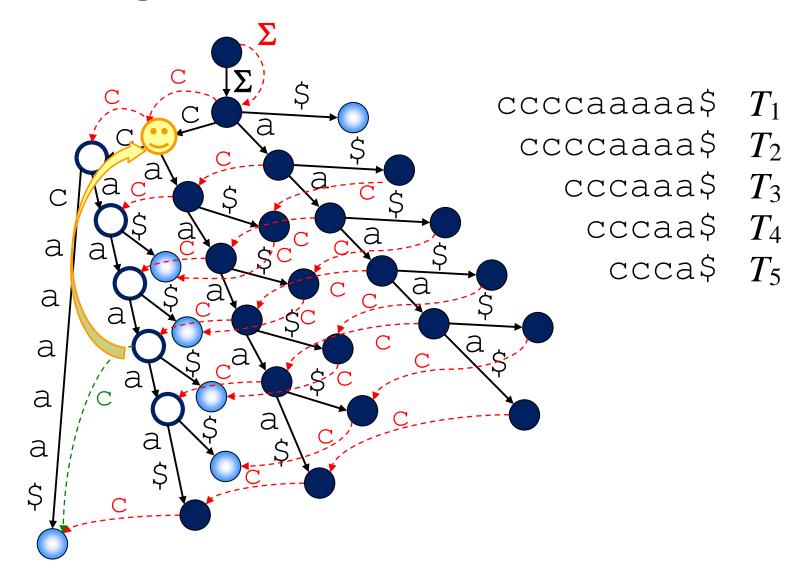
#### Theorem 3

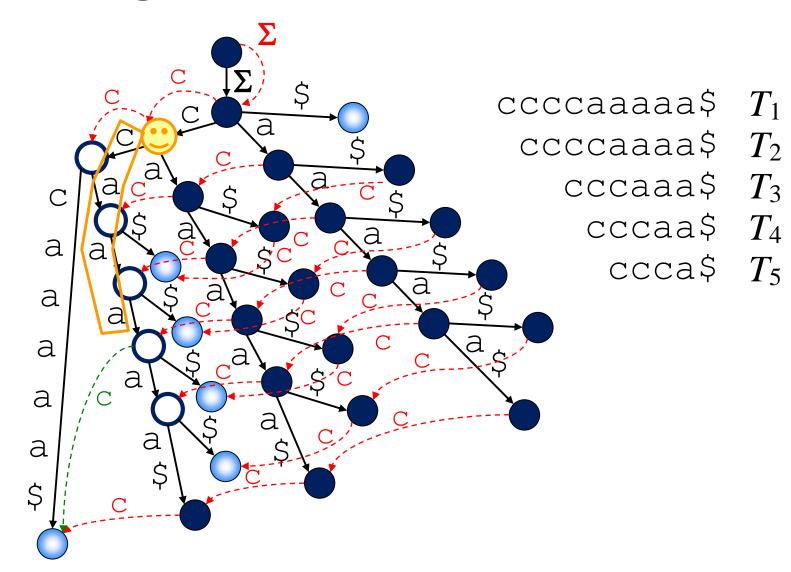
Blumer at al.'s left-to-right DAWG algorithm for fully-online multiple texts needs to update  $\Omega(N^{1.5})$  edges, and this bound is tight  $(O(N^{1.5}))$  in the worst case).

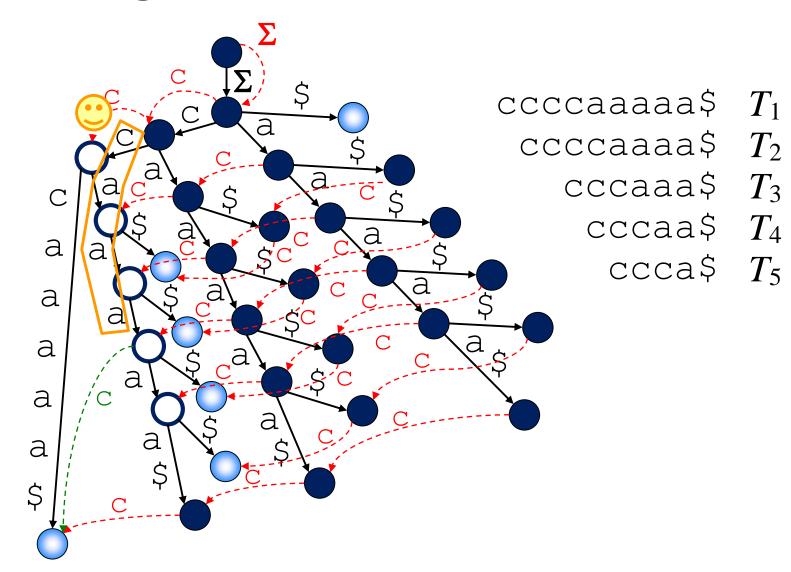
- Hard and soft Weiner links of texts form DAWG of reversed texts.
- Previous example requires  $\Omega(N^{1.5})$  updates for soft Weiner links.
- → We cannot maintain soft Weiner links explicitly...

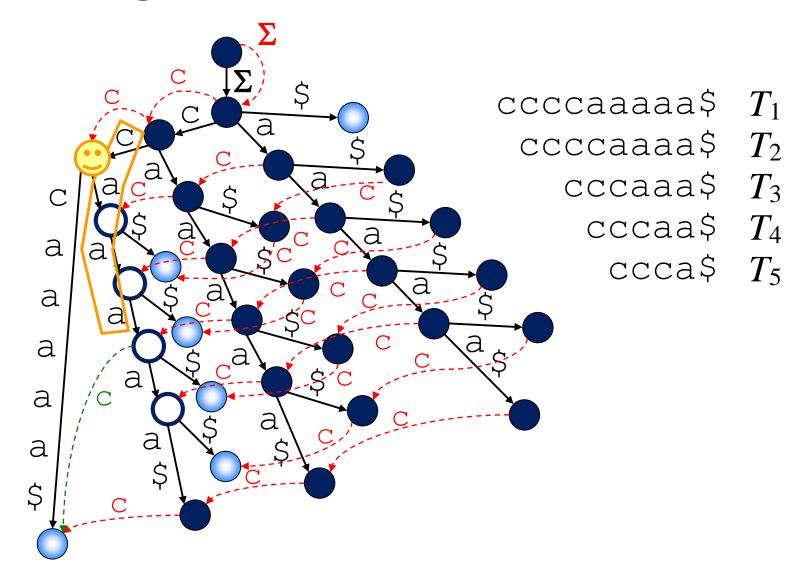


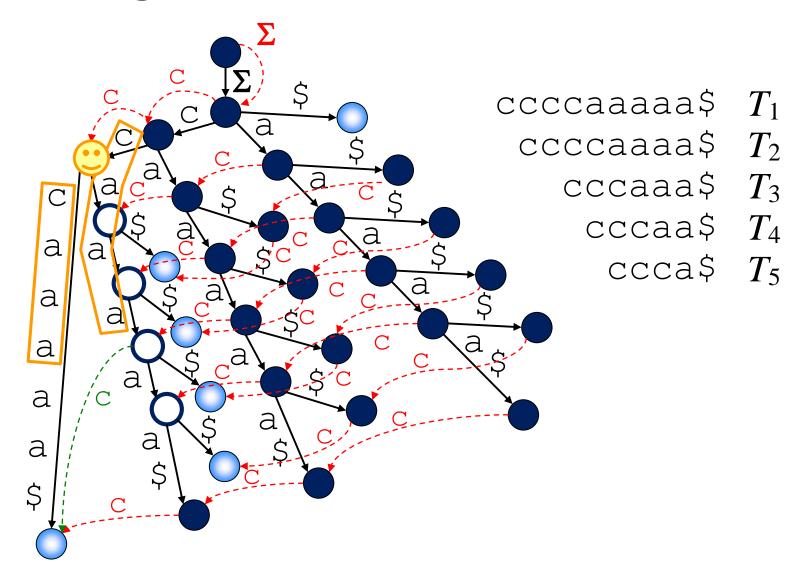


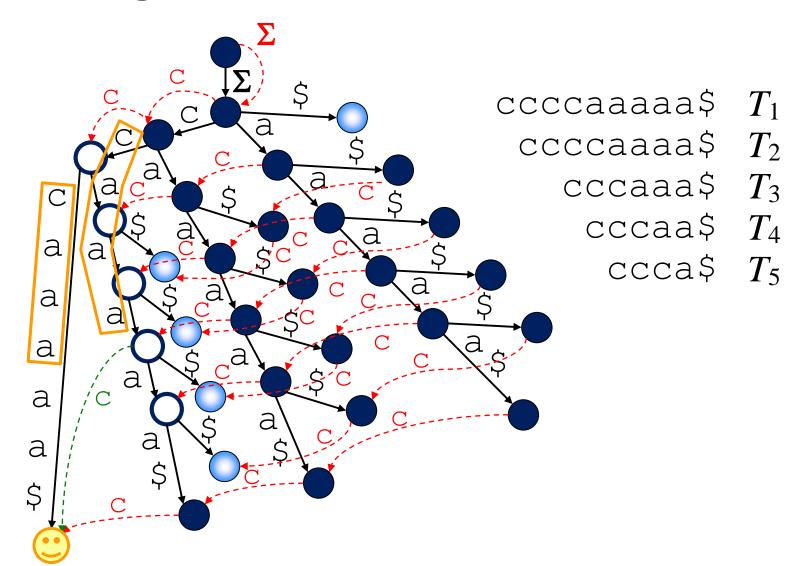












# **Fully-online DAWG construction**

#### Theorem 3

Blumer at al.'s left-to-right DAWG algorithm for fully-online multiple texts needs to update  $\Omega(N^{1.5})$  edges, and this bound is tight  $(O(N^{1.5}))$  in the worst case).

#### Theorem 4

Implicit representation of DAWG of multiple texts of total length N can be built in *left-to-right* fully-online manner in  $O(N \log \sigma)$  time with O(N) space.

 $\sigma$  is the alphabet size

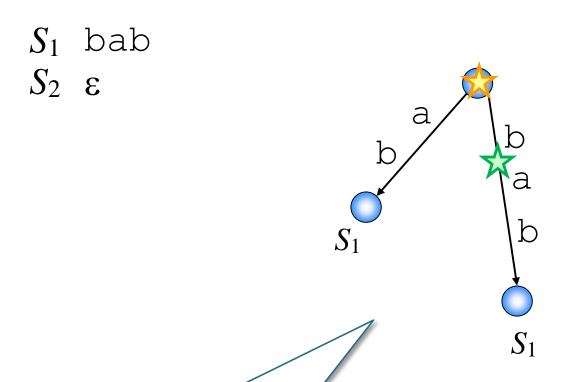
# Left-to-right suffix tree



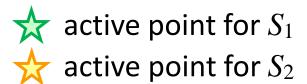
#### Claim 3

Suffix tree of multiple texts of total length N without leaf edge labels can be built in left-to-right fully-online manner in  $O(N \log \sigma)$  time with O(N) space, with the aid of DAWG.

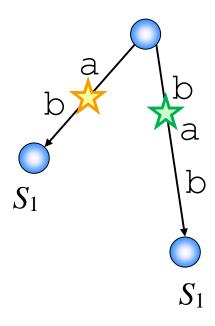
 $\sigma$  is the alphabet size



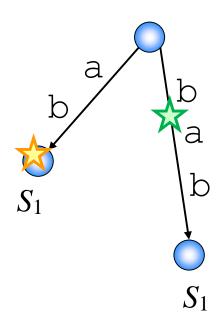
 $S_1$  is currently the owner of both leaves



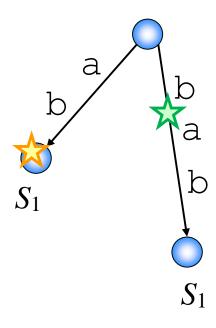
 $S_1$  bab  $S_2$  a

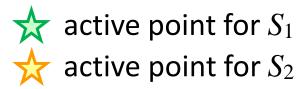


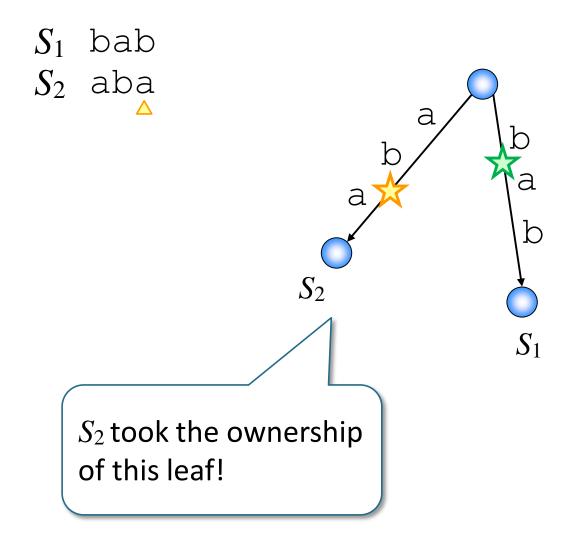
 $S_1$  bab  $S_2$  ab

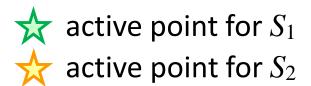


 $S_1$  bab $S_2$  aba

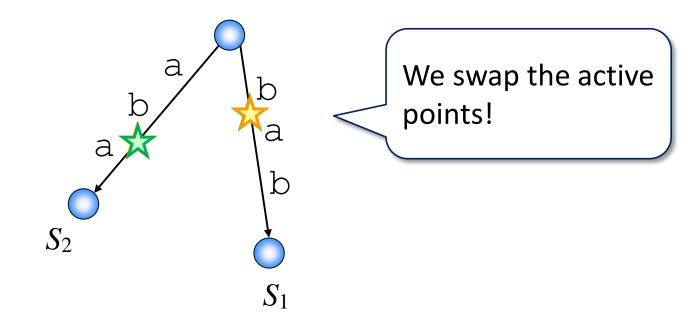


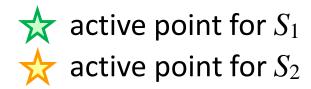




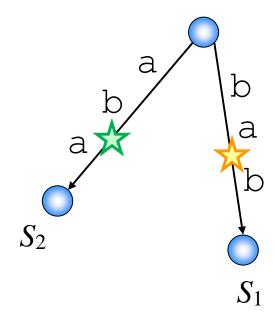


 $S_1$  bab $S_2$  aba

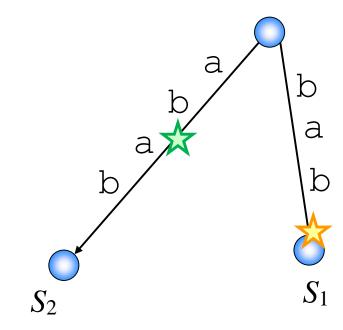


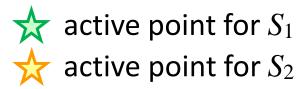


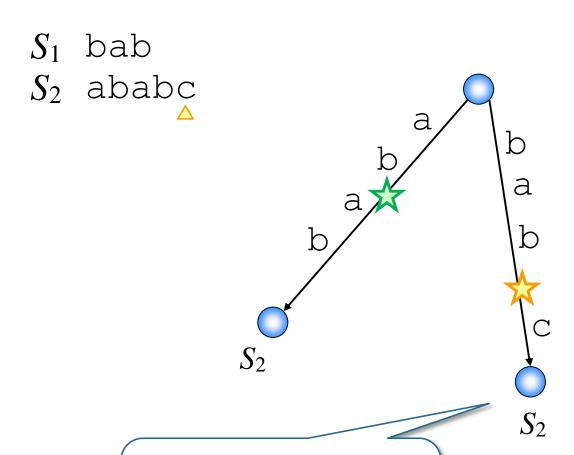
 $S_1$  bab $S_2$  aba



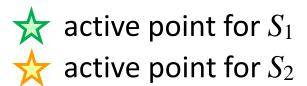
 $S_1$  bab  $S_2$  abab



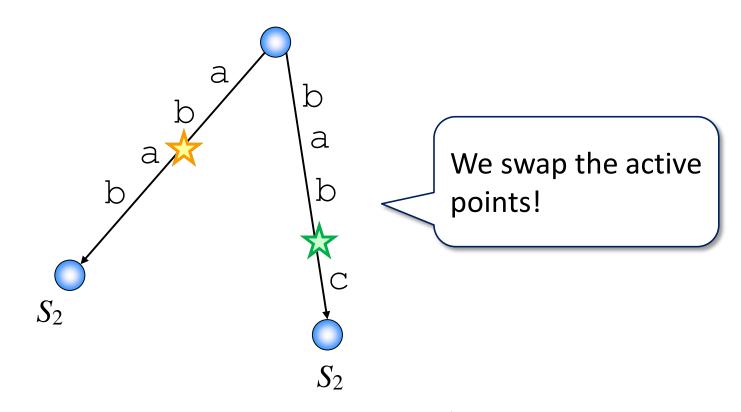


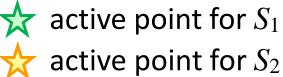


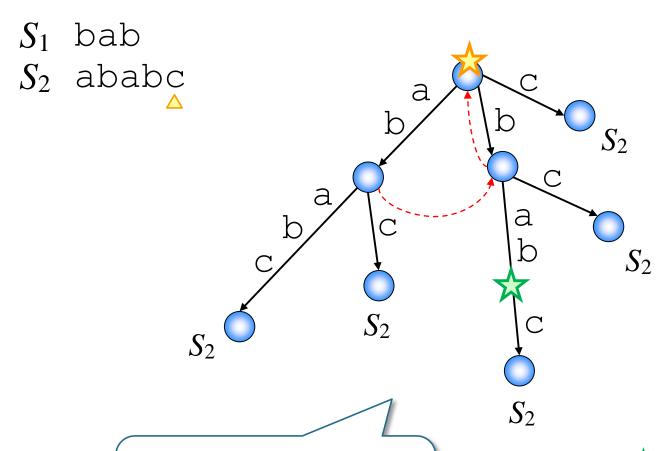
 $S_2$  took the ownership of this leaf, too!



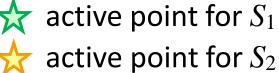
 $S_1$  bab $S_2$  ababc







 $S_2$  is now the owner of all leaves



#### Leaf ownership & active point swaps

... March, 2017

When the active point of a text extends a leaf, then we need to know the owner of that leaf. Also, we need to locate active points to swap.



Takuya Takagi



Hiroki Arimura



Me



**Danny Breslauer** 

## Leaf ownership & active point swaps

... March, 2017

But how?

No idea...



Takuya Takagi



Hiroki Arimura



Me



**Danny Breslauer** 

#### Final team!!

... March, 2017

I know how to do it!
We can do this using information from Weiner's tree.



Diptarama Hendrian



Takuya Takagi



Hiroki Arimura



Me



**Danny Breslauer** 

## The new paper

arXiv.org > cs > arXiv:1507.07622

Searc (<u>Help</u> |

Computer Science > Data Structures and Algorithms

# Fully-Online Suffix Tree and Directed Acyclic Word Graph Construction for Multiple Texts

Takuya Takagi, Shunsuke Inenaga, Hiroki Arimura, Dany Breslauer, Diptarama Hendrian

(Submitted on 28 Jul 2015 (v1), last revised 12 Jul 2018 (this version, v5))

We consider construction of the suffix tree and the directed acyclic word graph (DAWG) indexing data structures for a collection  $\mathcal T$  of texts, where a new symbol may be appended to any text in  $\mathcal T=\{T_1,\ldots,T_K\}$ , at any time. This fully-online scenario, which arises in dynamically indexing multi-sensor data, is a natural generalization of the long solved semi-online text indexing problem, where texts  $T_1,\ldots,T_k$  are permanently fixed before the next text  $T_{k+1}$  is processed for each  $1\leq k < K$ . We present fully-online algorithms that construct the suffix tree and the DAWG for  $\mathcal T$  in  $O(N\log\sigma)$  time and O(N) space, where N is the total lengths of the strings in  $\mathcal T$  and  $\sigma$  is their alphabet size. The standard explicit representation of the suffix tree leaf edges and some DAWG edges must be relaxed in our fully-online scenario, since too many updates on these edges are required in the worst case. Instead, we provide access to the updated suffix tree leaf edge labels and the DAWG edges to be redirected via auxiliary data structures, in  $O(\log\sigma)$  time per added character.

#### Theorem 5

Suffix tree of multiple texts of total length N without leaf edge labels can be built in left-to-right fully-online manner in  $O(N \log \sigma)$  time with O(N) space, with the aid of Weiner's tree.

 $\sigma$  is the alphabet size

Leaf ownership can be computed on-the-fly in  $O(\log \sigma)$  time only when leaf is extended.

#### Leaf ownership in fully-online Ukkonen

#### Theorem 6

It takes  $\Omega(N^2/K^2)$  time to explicitly maintain leaf ownership of Ukkonen's suffix tree for left-to-right fully-online multiple texts.

Thus it takes  $\Omega(N^2)$  time when K = O(1) and  $K \ge 2$ .

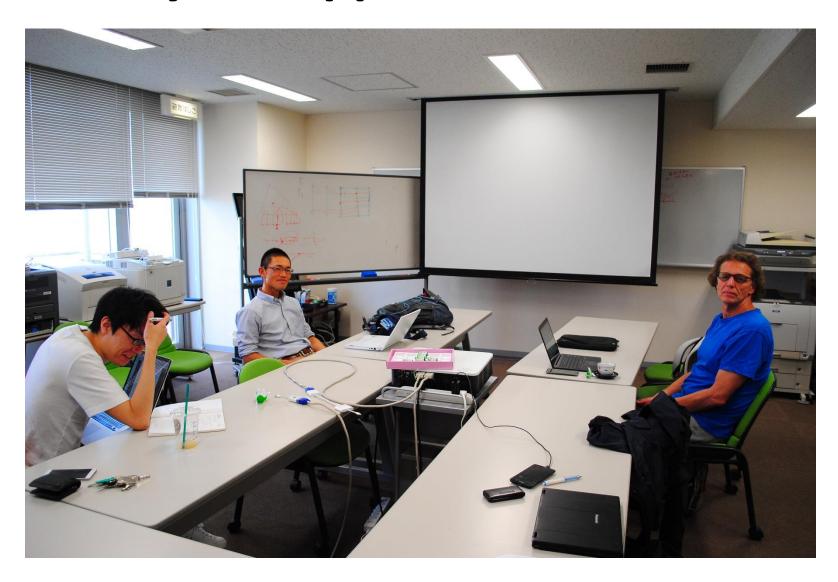
N =total text length

K = # of texts

## **Open questions**

- Linear-size data structure which can efficiently answer ownership of any leaf per query?
  - $O(\log N / \log \log N)$  time might be possible via dynamic NMA.
  - Danny believed O(1) or  $O(\log \sigma)$  would be possible.
- Stand-alone version of Ukkonen algorithm for left-to-right fully-online multiple texts?
- BWT for fully-online multiple texts?

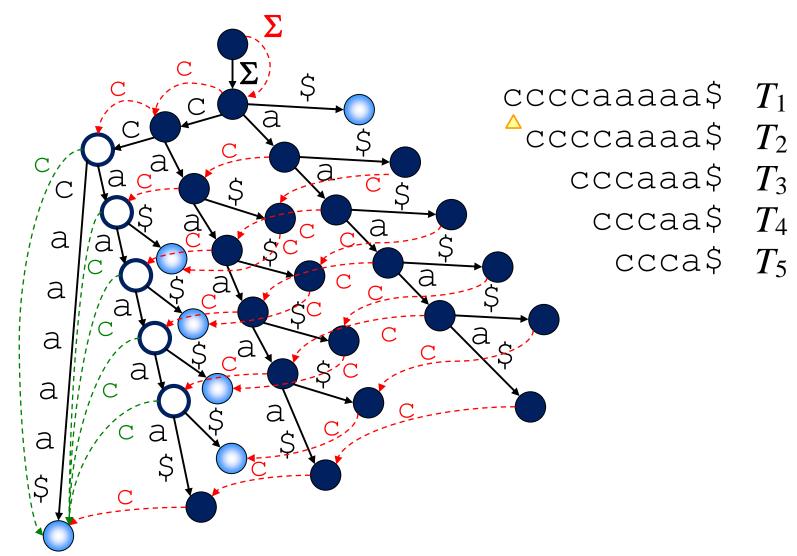
## Danny @ Sapporo, June 2017

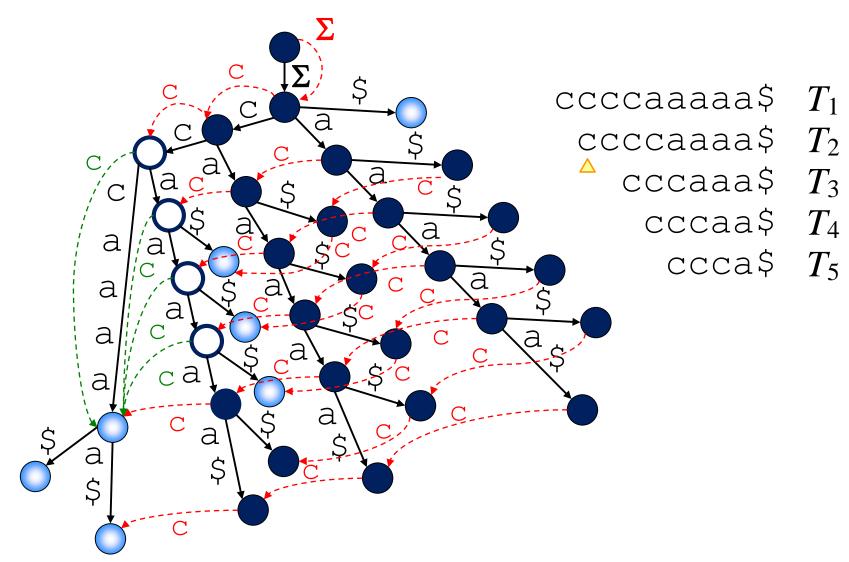


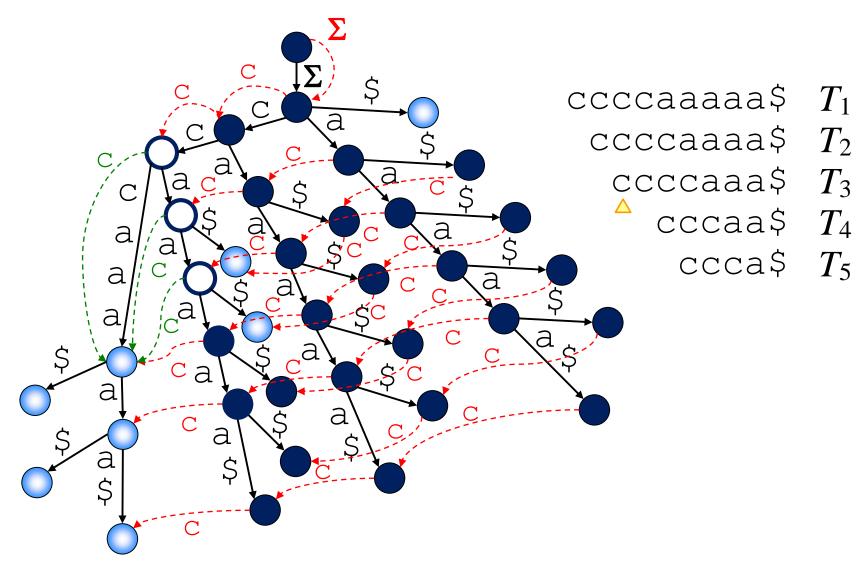
## **Appendix A**

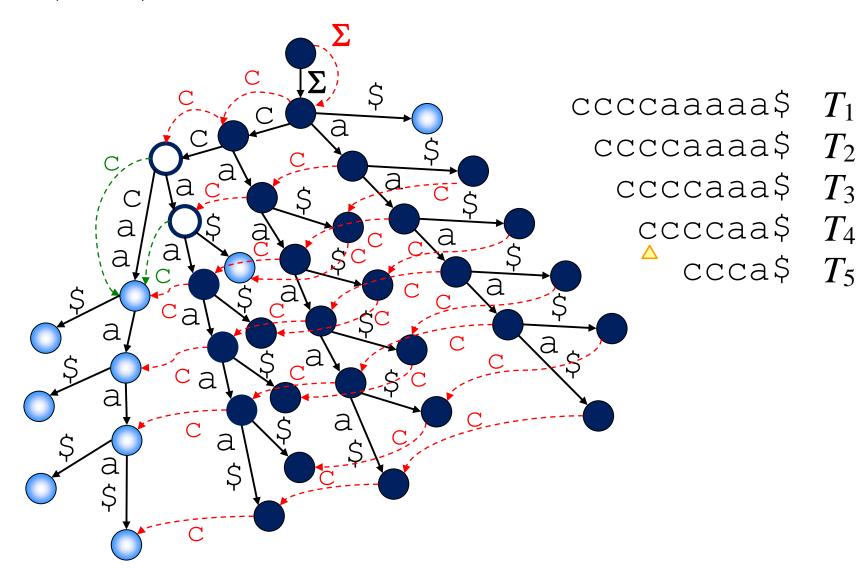
#### Theorem 3

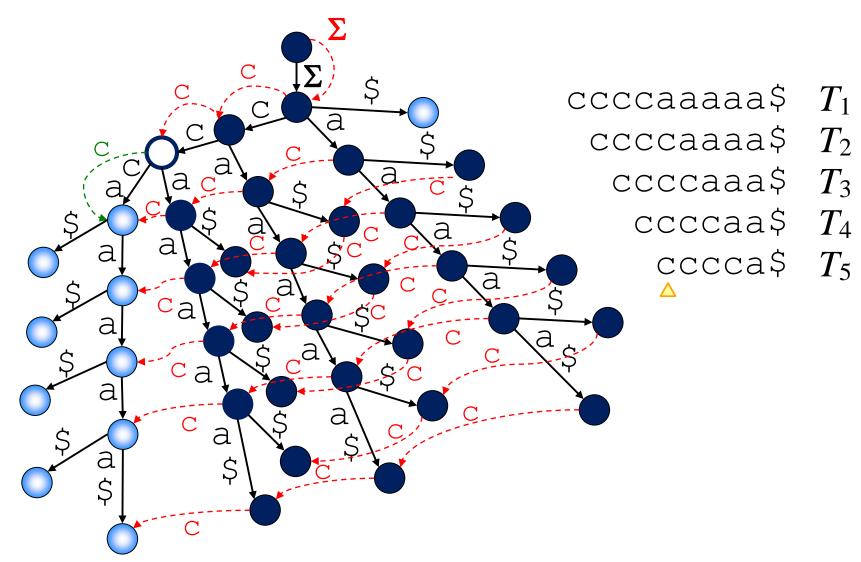
Blumer at al.'s left-to-right DAWG algorithm for fully-online multiple texts needs to update  $\Omega(N^{1.5})$  edges, and this bound is tight  $(O(N^{1.5}))$  in the worst case).











## **Appendix B**

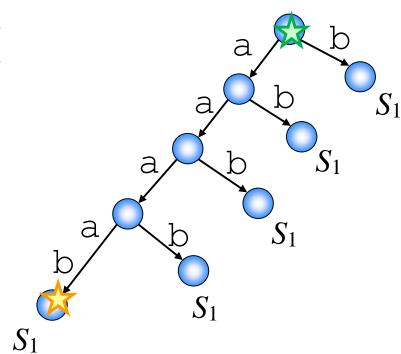
#### Theorem 6

It takes  $\Omega(N^2/K^2)$  time to explicitly maintain leaf ownership of Ukkonen's suffix tree for left-to-right fully-online multiple texts.

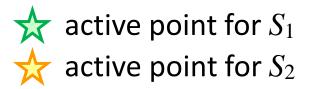
Thus it takes  $\Omega(N^2)$  time when K = O(1) and  $K \ge 2$ .

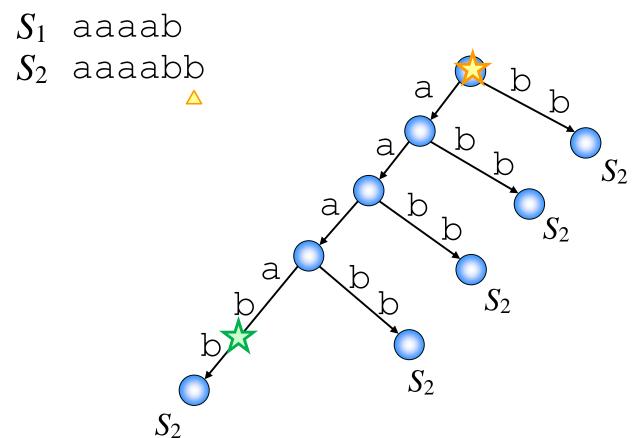
N =total text length K =# of texts

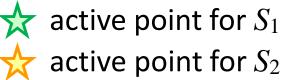
 $S_1$  aaaab $S_2$  aaaab $^{ riangle}$ 



 $S_1$  aaaab  $S_2$  aaaabb







 $S_1$  aaaab  $S_2$  aaaabb

