

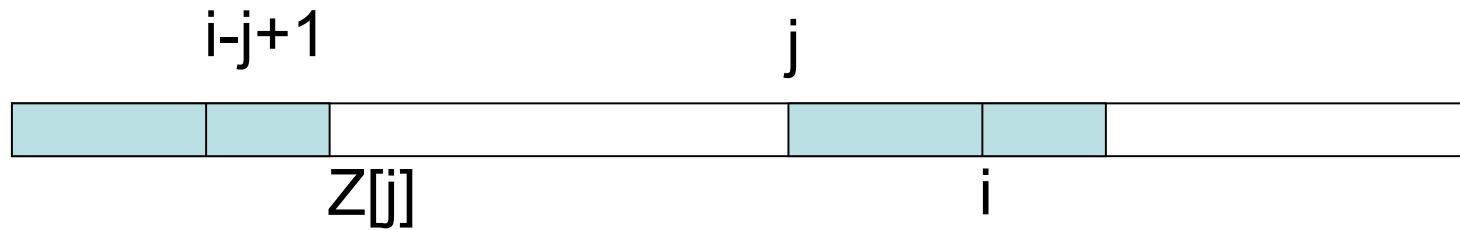
# CMSC423: Bioinformatic Algorithms, Databases and Tools

## Lecture 7

Exact string matching  
Suffix trees  
Suffix arrays

# Basic idea: 1-D dynamic programming

Can  $Z[i]$  be computed with the help of  $Z[j]$  for  $j < i$ ?



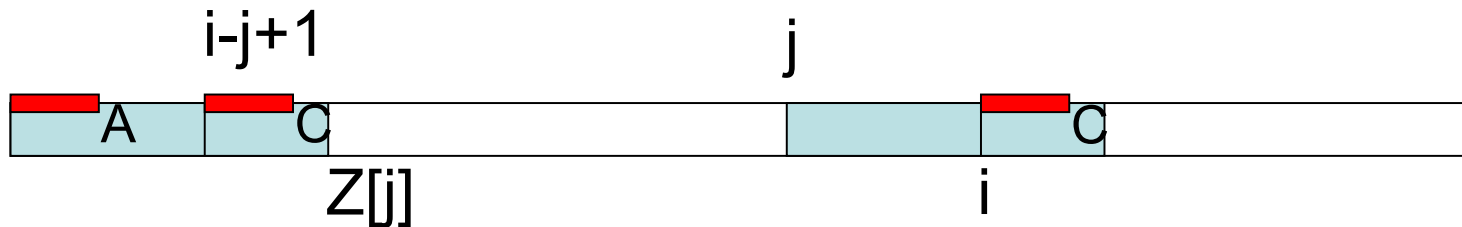
Assume there exists  $j < i$ , s.t.  $j + Z[j] - 1 > i$   
then  $Z[i - j + 1]$  provides information about  $Z[i]$

If there is no such  $j$ , simply compare characters  $T[i..]$  to  $T[0..]$   
since they have not been seen before.

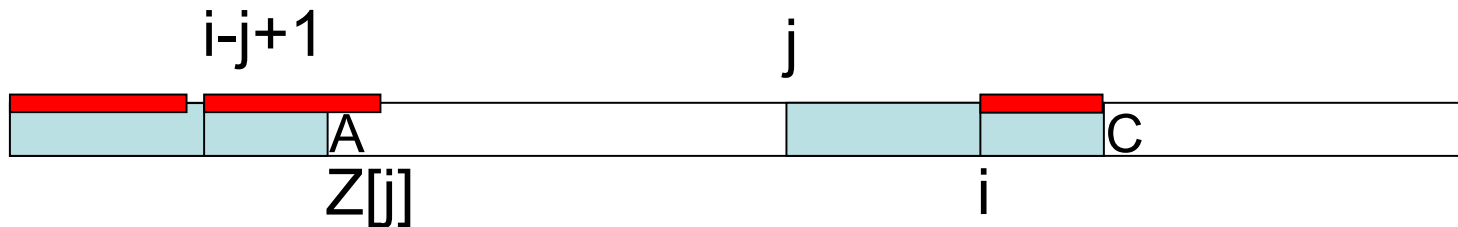
# Three cases

Let  $j < i$  be the coordinate that maximizes  $j + Z[j] - 1$   
 (intuitively, the  $Z[j]$  that extends the furthest)

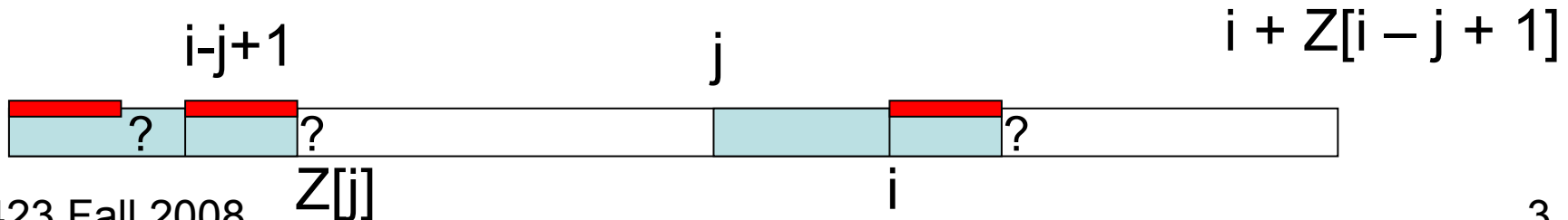
I.  $Z[i - j + 1] < Z[j] - i + j - 1 \Rightarrow Z[i] = Z[i - j + 1]$



II.  $Z[i - j + 1] > Z[j] - i + j - 1 \Rightarrow Z[i] = Z[j] - i + j - 1$



III.  $Z[i - j + 1] = Z[j] - i + j - 1 \Rightarrow Z[i] = ??$ , compare from



# Time complexity analysis

- Why do these tricks save us time?
    1. Cases I and II take constant time per Z-value computed – total time spent in these cases is  $O(n)$
    2. Case III might involve 1 or more comparisons per Z-value however:
      - every successful comparison (match) shifts the rightmost character that has been visited
      - every unsuccessful comparison terminates the “round” and algorithm moves on to the next Z-value
- total time spent in III cannot be more than # of characters in the text

Overall running time is  $O(n)$

# Space complexity?

- If using Z algorithm for matching, how many Z values do we need to store?

PPPPPPPPP\$TT

- Only need to remember Z-values for pattern and the “farthest reaching Z-value” ( $Z[j]$  in what we discussed before)

# Z algorithm, not just for matching

- Lempel-Ziv compression (e.g. gzip)

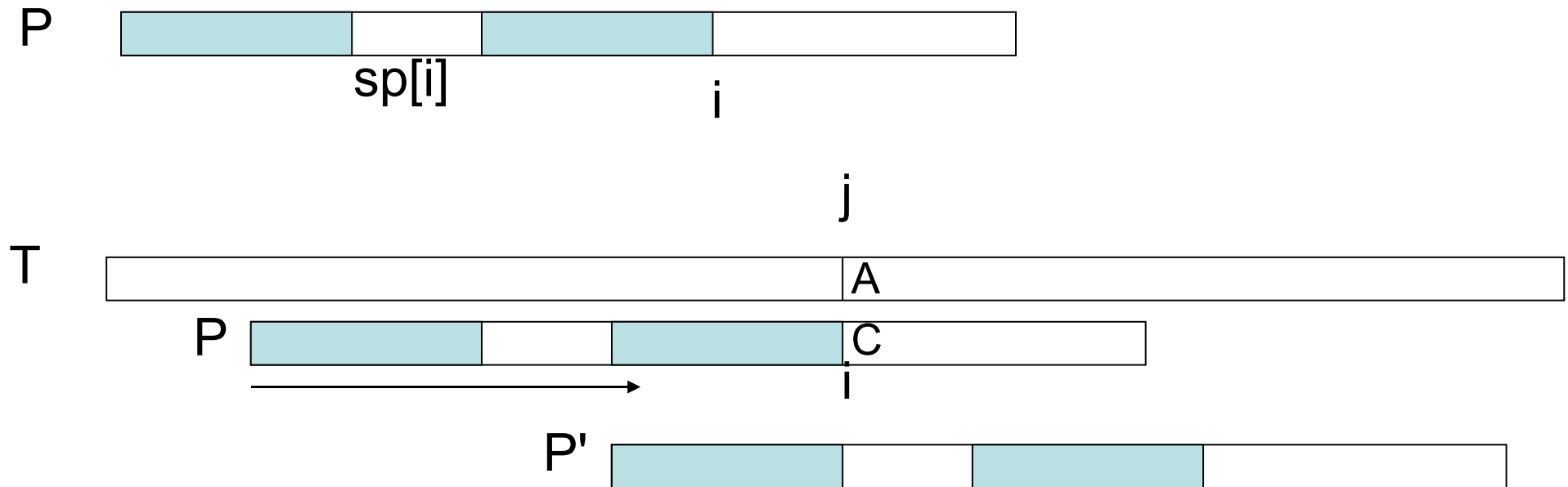


if  $Z[i] = 0$ , just send/store the character  $T[i]$ , otherwise, instead of sending  $T[i..i+Z[i] - 1]$  ( $Z[i] - 1$  characters/bytes) simply send  $Z[i]$  (one number)

- Note: other exact matching algorithms used for data compression (e.g. Burrows-Wheeler transform relates to suffix arrays)

# Knuth-Morris-Pratt algorithm

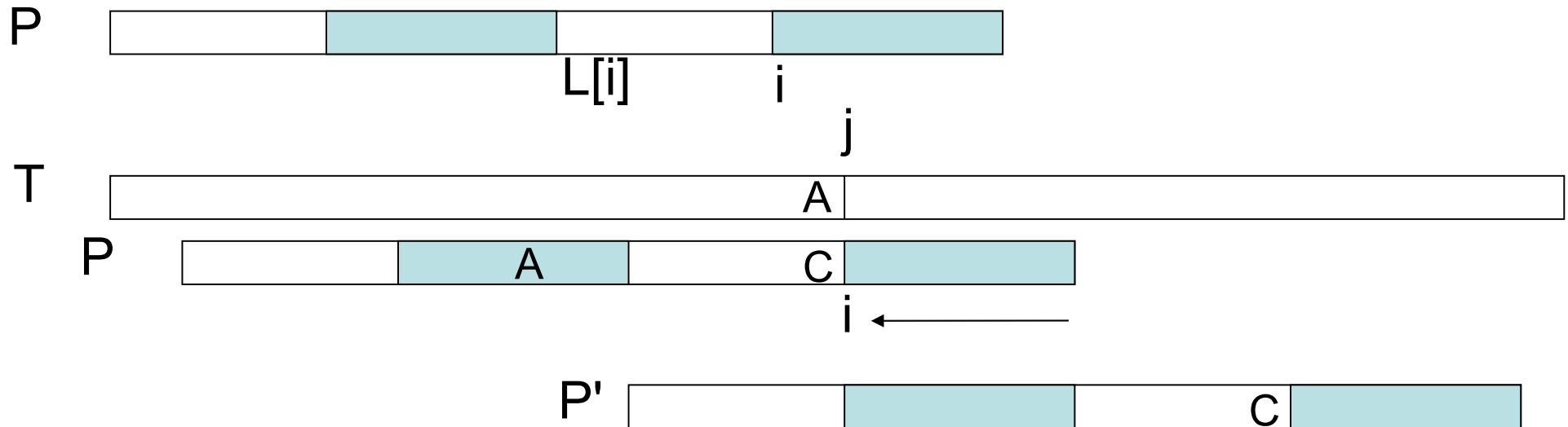
Given a Pattern and a Text, preprocess the Pattern to compute  $sp[i]$  = length of longest prefix of P that matches a suffix of  $P[0..i]$



Compare  $P$  with  $T$  until finding a mis-match (at coordinate  $i + 1$  in  $P$  and  $j + 1$  in  $T$ ). Shift  $P$  such that first  $sp[i]$  characters match  $T[j - sp[i] + 1 .. j]$ . Continue matching from  $T[i+1]$ ,  $P[sp[i]+1]$

# Boyer-Moore algorithm

Preprocess the pattern, computing, for every  $i$ ,  $L[i] =$  largest coordinate  $< n$ , s.t.  $P[i..n]$  matches a suffix of  $P[1..L[i]]$  (inverted Z function)



Match the pattern backwards (starting at the right) until mismatch.  
Shift the pattern such that  $P[L[i] - n + i + 1]$  matches at  $T[j]$   
Repeat.

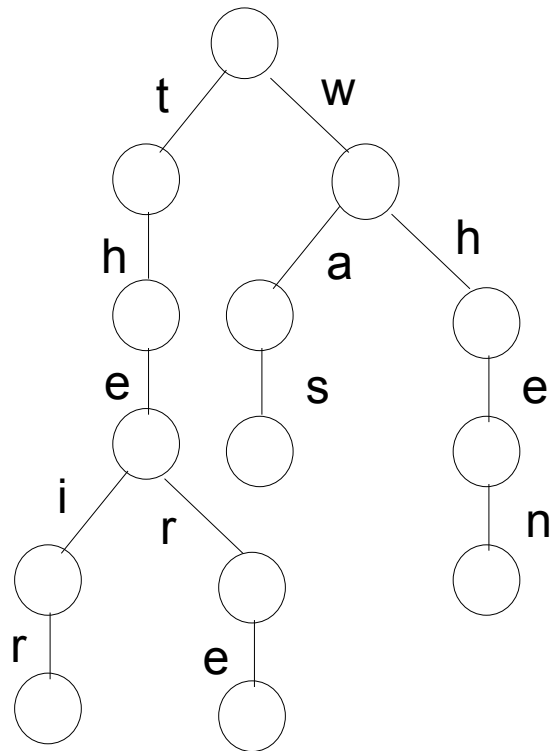
Bad character rule: find character  $T[j - 1]$  in  $P$  and shift until it matches. Choose the longest shift (btwn. suffix & char. rules)



# Suffix trees

# Intro to suffix trees

- Used in fast exact matching
- Basic idea: extend a trie – structure for storing multiple strings

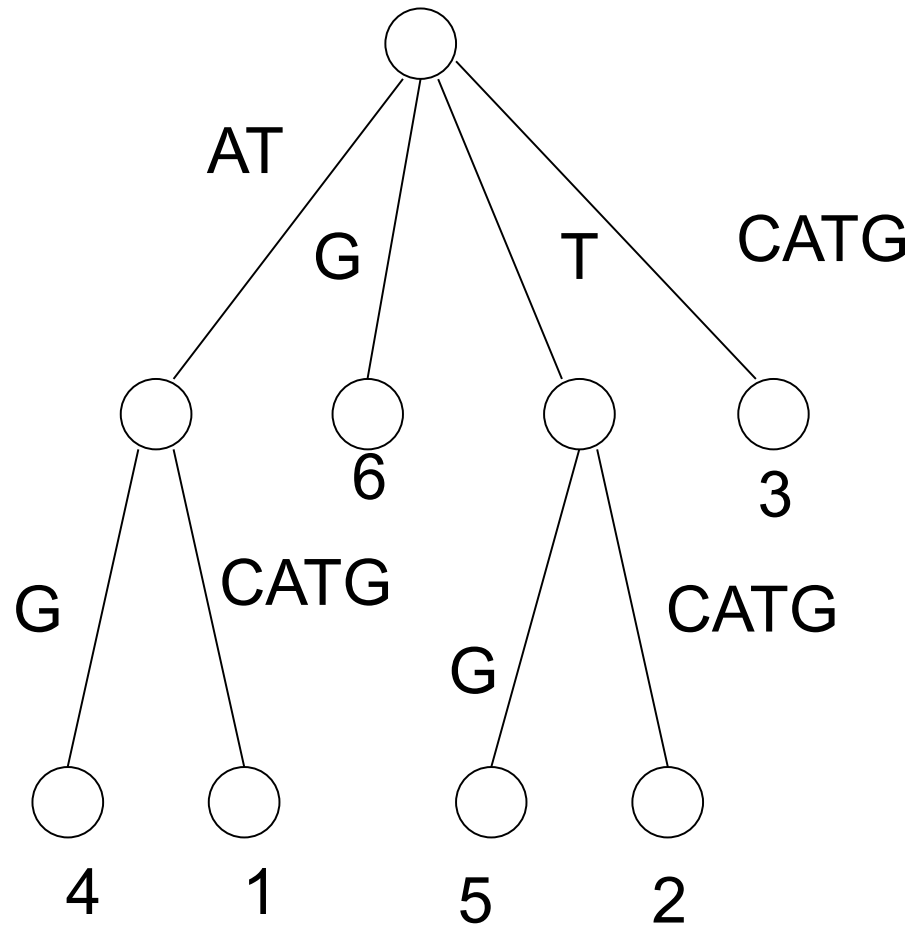


their  
there  
was  
when

# Suffix tree

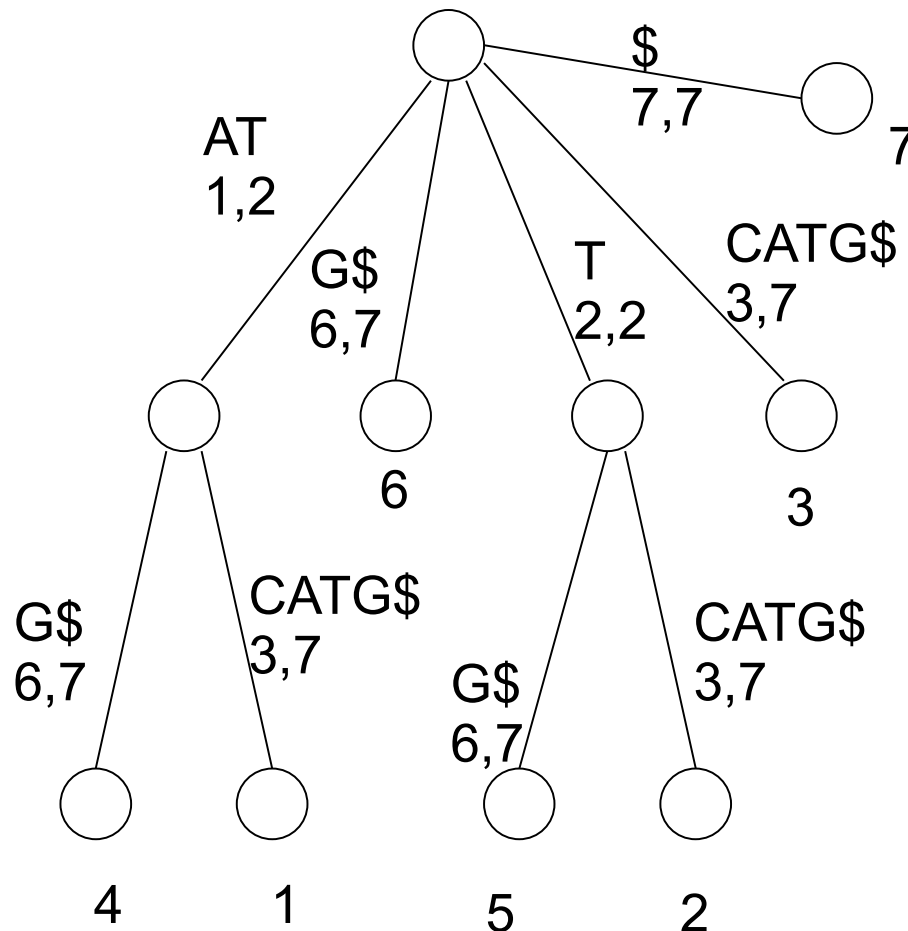
- Extends trie of all suffixes of a string

1 ATCATG  
2 TCATG  
3 CATG  
4 ATG  
5 TG  
6 G



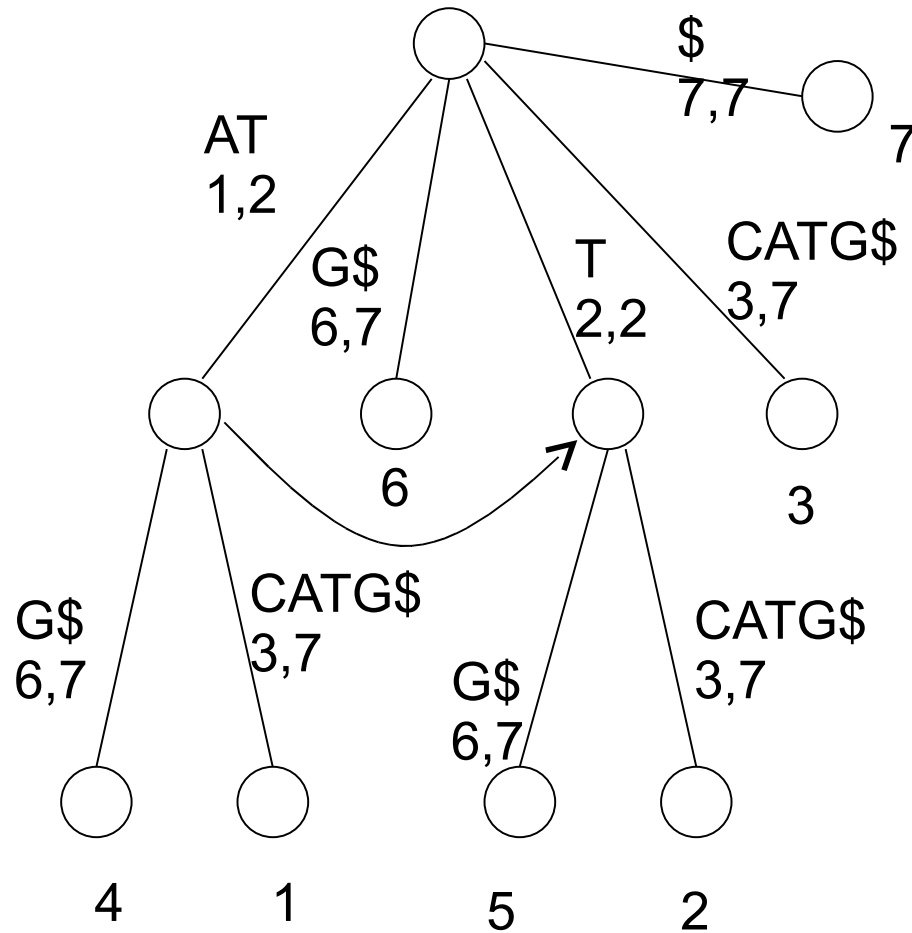
# Suffix tree ...cont

- To store in linear time – just store range in sequence instead of string
- To ensure suffixes end at leaves, add \$ char at end of string
- ATCATG\$



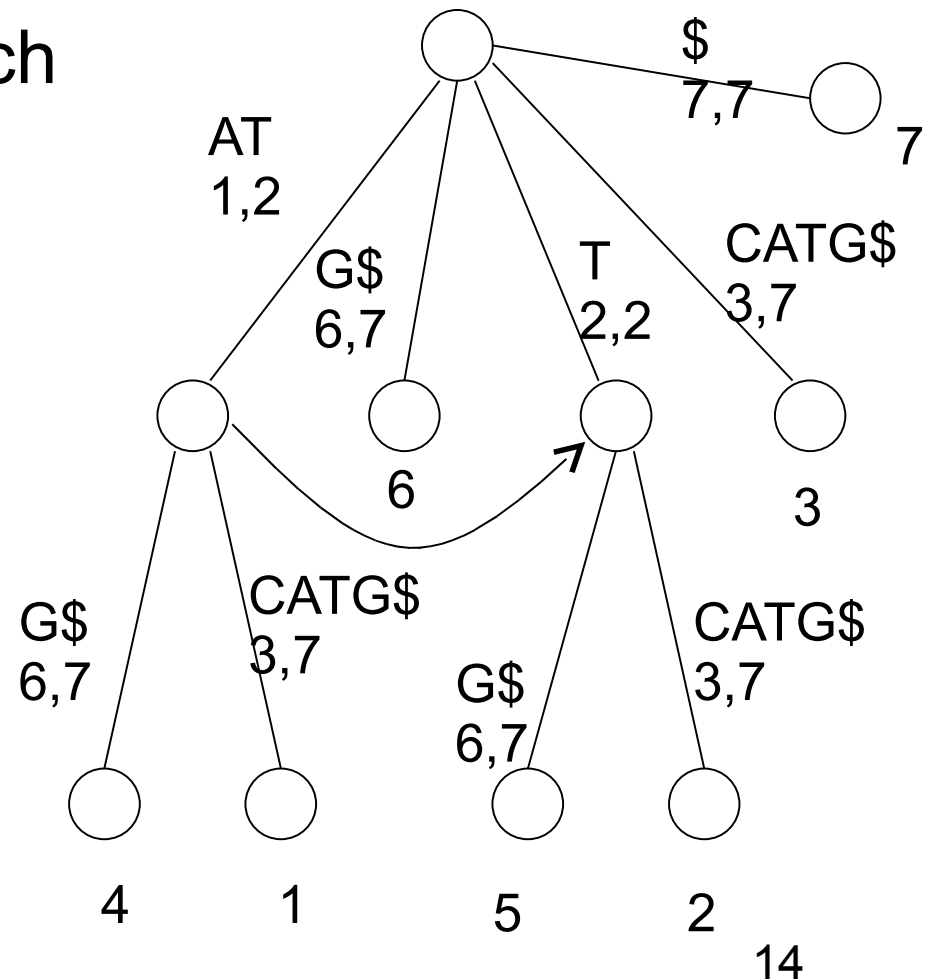
# Suffix links

- Link every node labeled  $aS$  for some string  $S$  to node labeled  $S$  (note – it always exists)



# Suffix trees for matching

- Suffix trees use  $O(n)$  space
  - Suffix trees can be constructed in  $O(n)$  time
  - Is CAT part of ATCATG ?
  - Match from root, char by char
  - If run out of query – found match
  - otherwise, there is no match
- 
- intuition: CAT is the prefix of some suffix



# Suffix links – useful for substring matches

- Does any part of AGATG match string AGCAGT?

