

# CMSC423: Bioinformatic Algorithms, Databases and Tools

## Lecture 8

Sequence alignment:

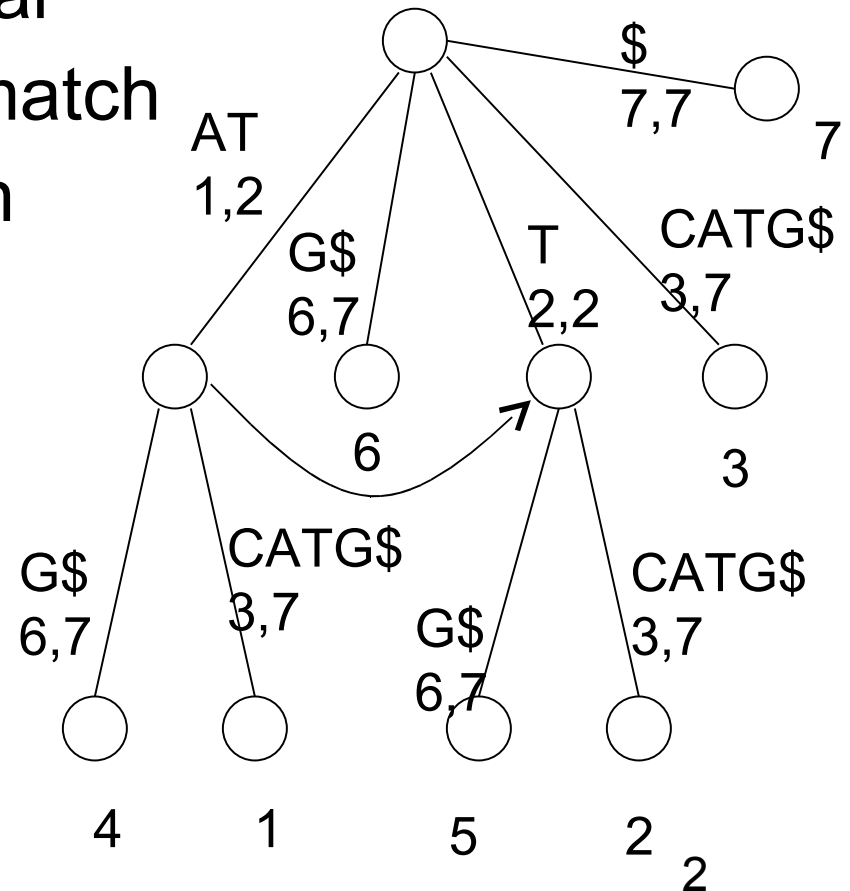
exact alignment

inexact alignment

dynamic programming, gapped  
alignment

# Suffix trees for matching

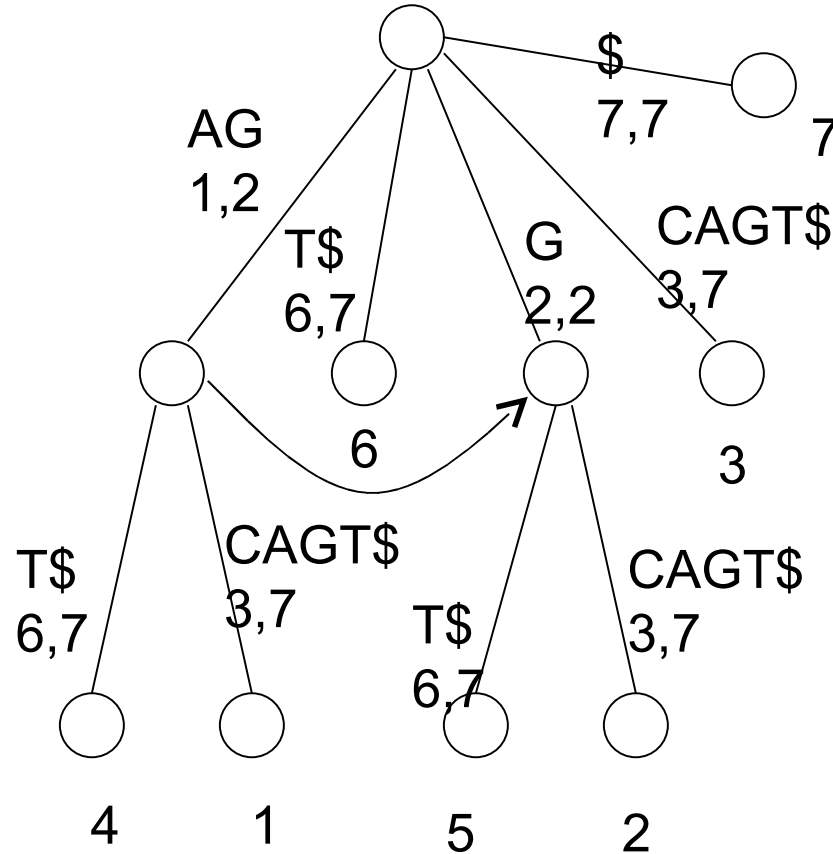
- Suffix trees use  $O(n)$  space
- Suffix trees can be constructed in  $O(n)$  time
- Is CAT part of ATCATG ?
- Match from root, char by char
- If run out of query – found match
- otherwise, there is no match



- intuition: CAT is the prefix of some suffix

# Suffix links – useful for substring matches

- Does any part of AGATG match string AGCAGT?



# Other uses

- Finding repeats
  - internal nodes with multiple children – DNA that occurs in multiple places in the genome
- Longest common substring of two strings
  - build suffix tree of both strings. Find lowest internal node that has leaves from both strings
  - or: build suffix tree on one string and use suffix links to find longest match
- Note: running time for matching is  $O(|\text{Pattern}|)$ , not  $O(|\text{Pattern}| + |\text{Text}|)$  (though  $O(|\text{Text}|)$  was spent in pre-processing)

# Why do we care?

- Suffix trees are used for
  - mapping reads to a genome (e.g. personal genomics)
  - comparing genomes (comparative genomics)
  - finding repeats
  - identifying genome signatures
- Exact matching – what to expect on exams
  - build a suffix tree for a string
  - answer some questions about one of the algorithms, e.g. for Z algorithm – is it necessary  $j$  be the farthest reaching Z-value or just any Z value extending past  $i$ ?
  - do something with the help of some of the algorithms (e.g. look for repeats that occur exactly twice, etc.)

# Suffix arrays

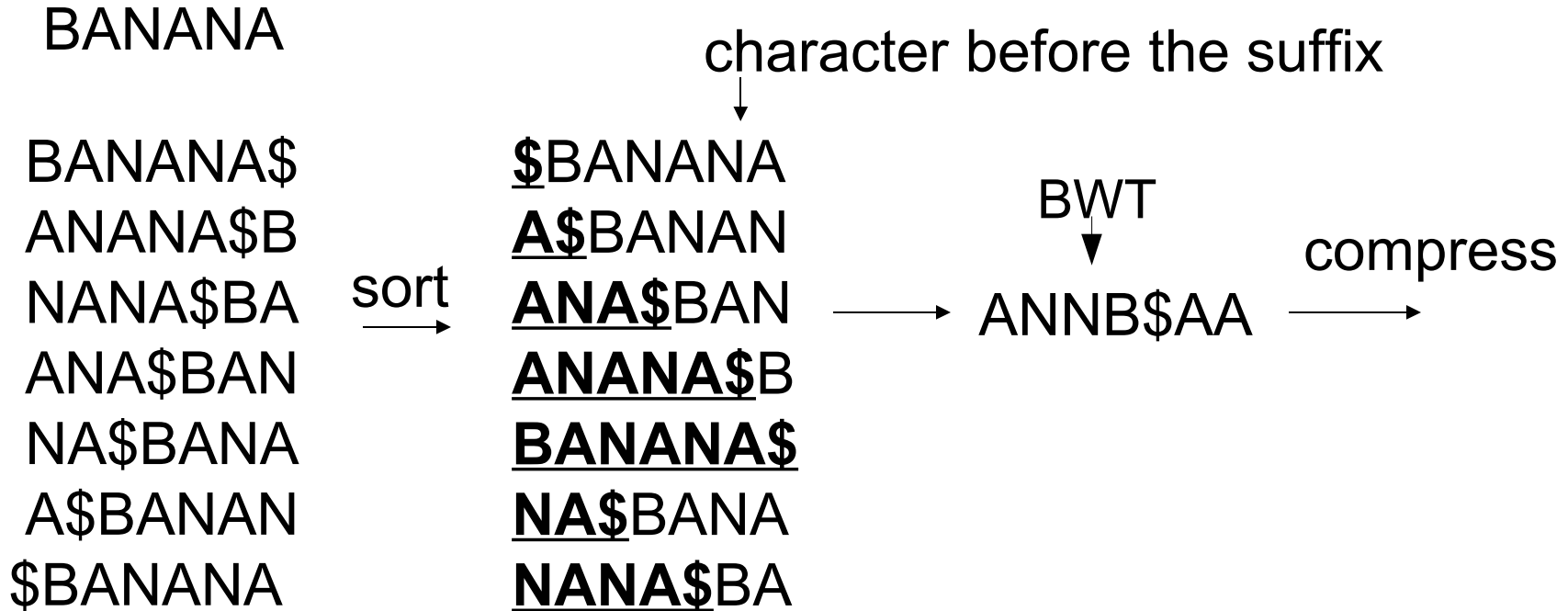
- Suffix trees are expensive > 20 bytes / base
- Suffix arrays: lexicographically sort all suffixes

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

- Can quickly find the correct suffix through binary search
- Note: much less space, but longer running time (incur a  $\log(n)$  term)

# Suffix arrays and compression

- Burrows-Wheeler transform



Note: characters in last column occur in same order as in first column

Useful for matching within BWT

# BWT – string matching

- Look for “BANA”
- Start at end (match right to left)
- Find character in rightmost column
- Identify corresponding range in first column
- Switch back to last column

- ...
- How do we know the first A in the pattern is the 2nd/3rd from the top of the matrix?
- Note: add'l data needed:  
# of times each letter appears before every pos'n
- Running time?

			ABN\$
	<u>\$</u> BANANA		0000
→	<u>A</u> \$BANAN	←	1000
A	<u>A</u> <u>N</u> A\$BAN	←	1010
A	<u>A</u> <u>N</u> <u>A</u> <u>N</u> A\$B	←	1020
	<u>B</u> ANANA\$		1120
→	<u>N</u> A\$BANA	←	1121
→	<u>N</u> <u>A</u> <u>N</u> A\$BA	←	2121

$O(\text{len}(P))$  operations. Each may cost  $O(\log(\text{len}(T)))$



# Exact alignment recap

- Exact matching can be done efficiently:  
 $O(|\text{Text}| + |\text{Pattern}|)$
- Key idea: preprocess data to keep track of similar regions, then use information to "jump" over places where no match can occur

