

CS 10:
Problem solving via Object Oriented
Programming
Winter 2017

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String finding

Agenda

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1. Boyer-Moore algorithm
 2. Tries
 3. Suffix tries

Matching/recognizing patterns in sequences is a common CS problem

Example: Find pattern in DNA data

```
AGGACGCCGCATTGACCATCTATGAGATGCTCCAGAACATCTTTGCTATTTTCAG
ACAAGATTCATCTAGCACTGGCTGGAATGAGACTATTGTTGAGAACCTCCTGGCT
AATGTCTATCATCAGATAAACCATCTGAAGACAGTCCTGGAAGAAAACTGGAGA
AAGAAGATTTTACCAGGGGGAAAACTCATGAGCAGTCTGCACCTGAAAAGATATTA
ATGACCAACAAGTGTCTCCTCCAAATTGCTCTCCTGTTGTGCTTCTCCACTACAG
CTCTTTCCATGAGCTACAACCTTGCTTGGATTCTACAAAGAAGCAGCAATTTTCA
GTGTCAGAAGCTCCTGTGGCAATTGAATGGGAGGCTTGAATACTGCCTCAAGCAC
AGGATGAACTTTGACATCCCTGAGGAGATTAAGCAGCTGCAGCAGTTCCAGAAGG
ATGACCAACAAGTGTCTCCTCCAAATTGCTCTCCTGTTGTGCTTCTCCACTACAG
CTCTTTCCATGAGCTACAACCTTGCTTGGATTCTACAAAGAAGCAGCAATTTTCA
GTGTCAGAAGCTCCTGTGGCAATTGAATGGGAGGCTTGAATACTGCCTCAAGCAC
AGGATGAACTTTGACATCCCTGAGGAGATTAAGCAGCTGCAGCAGTTCCAGAAGG
AGGACGCCGCATTGACCATCTATGAGATGCTCCAGAACATCTTTGCTATTTTCAG
ACAAGATTCATCTAGCACTGGCTGGAATGAGACTATTGTTGAGAACCTCCTGGCT
AATGTCTATCATCAGATAAACCATCTGAAGACAGTCCTGGAAGAAAACTGGAGA
AAGAAGATTTTACCAGGGGGAAAACTCATGAGCAGTCTGCACCTGAAAAGATATTA
TGGGAGGATTCTGCATTACCTGAAGGCCAAGGAGTACAGTCACTGTGCCTGGACC
ATAGTCAGAGTGGAATCCTAAGGAACTTTTACTTCATTAACAGACTTACAGGTT
AGGACGCCGCATTGACCATCTATGAGATGCTCCAGAACATCTTTGCTATTTTCAG
ACAAGATTCATCTAGCACTGGCTGGAATGAGACTATTGTTGAGAACCTCCTGGCT
AATGTCTATCATCAGATAAACCATCTGAAGACAGTCCTGGAAGAAAACTGGAGA
AAGAAGATTTTACCAGGGGGAAAACTCATGAGCAGTCTGCACCTGAAAAGATATTA
TGGGAGGATTCTGCATTACCTGAAGGCCAAGGAGTACAGTCACTGTGCCTGGACC
ATAGTCAGAGTGGAATCCTAAGGAACTTTTACTTCATTAACAGACTTACAGGTT
```

Task

Find a substring
in this large
string

A brute force approach is inefficient, $O(nm)$

Find query of length m , in text of length n

Index	0	1	2	3	4	5	6	7	8	9	10	11
Text	A	B	C	Z	E	F	A	B	C	D	E	F
Try 0	A	B	C	D	E	F						

- Start at index 0
- Loop over length of query string
- Look for match
- Move right one space if no match
- $O(nm)$

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Mismatch, slide query one space right
and try again

- Start at index 0
- Loop over length of query string
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Text	A	B	C	Z	E	F	A	B	C	D	E	F
Try 0	A	B	C	D	E	F						
1		A	B	C	D	E	F					

Mismatch, slide query one space right
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Try 0	A	B	C	D	E	F						
1		A	B	C	D	E	F					

...

$n-m+1$

A	B	C	D	E	F
---	---	---	---	---	---

- Start at index 0
- Loop over length of query string
- Look for match
- Move right one space if no match
- $O(nm)$

Match found after $n-m+1$
checks, each of length m , $O(nm)$

Boyer-Moore algorithm works backwards

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Try 0	A	B	C	D	E	F						

- Start at index m
- Loop backward over query string
- Look for match

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Try 0	A	B	C	D	E	F						

- Start at index m
- Loop backward over query string
- Look for match

On mismatch, slide query to last occurrence of text, or past mismatch

Find query of length m , in text of length n

Index	0	1	2	3	4	5	6	7	8	9	10	11
Text	A	B	C	Z	E	F	A	B	C	D	E	F
Try 0	A	B	C	D	E	F						
1					A	B	C	D	E	F		

Z not in query, so move query beyond mismatch index, try again

- Start at index m
- Loop backward over query string
- Look for match
- Slide query to last occurrence of text, or past mismatch

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Find query of length m , in text of length n

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Text	A	B	C	Z	E	F	A	B	C	D	E	F
Try 0	A	B	C	D	E	F						
1					A	B	C	D	E	F		

Mismatch, so move last occurrence of D
in query to this index

- Start at index m
- Loop backward over query string
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Try 0	A	B	C	D	E	F						
1					A	B	C	D	E	F		
2							A	B	C	D	E	F

- Start at index m
- Loop backward over query string
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Text	A	B	C	Z	E	F	A	B	C	D	E	F
Try 0	A	B	C	D	E	F						
1					A	B	C	D	E	F		
2							A	B	C	D	E	F

Match found

- Start at index m
- Loop backward over query string
- Look for match
- Slide query to last occurrence of text, or past mismatch

Boyer-Moore can be $O(n)$

- Our version not quite $O(n)$, but close
- $O(m+n)$, but since normally $n \gg m$, $O(n)$ on “reasonable” text (e.g., not long strings of same character)
- Does require pre-processing step to store last index of each character in query. Easy way:
 - Loop over each character in text to be searched
 - Store characters in Map with index as value
 - At end, Map will have the last index for each character

Agenda

1. Boyer-Moore algorithm

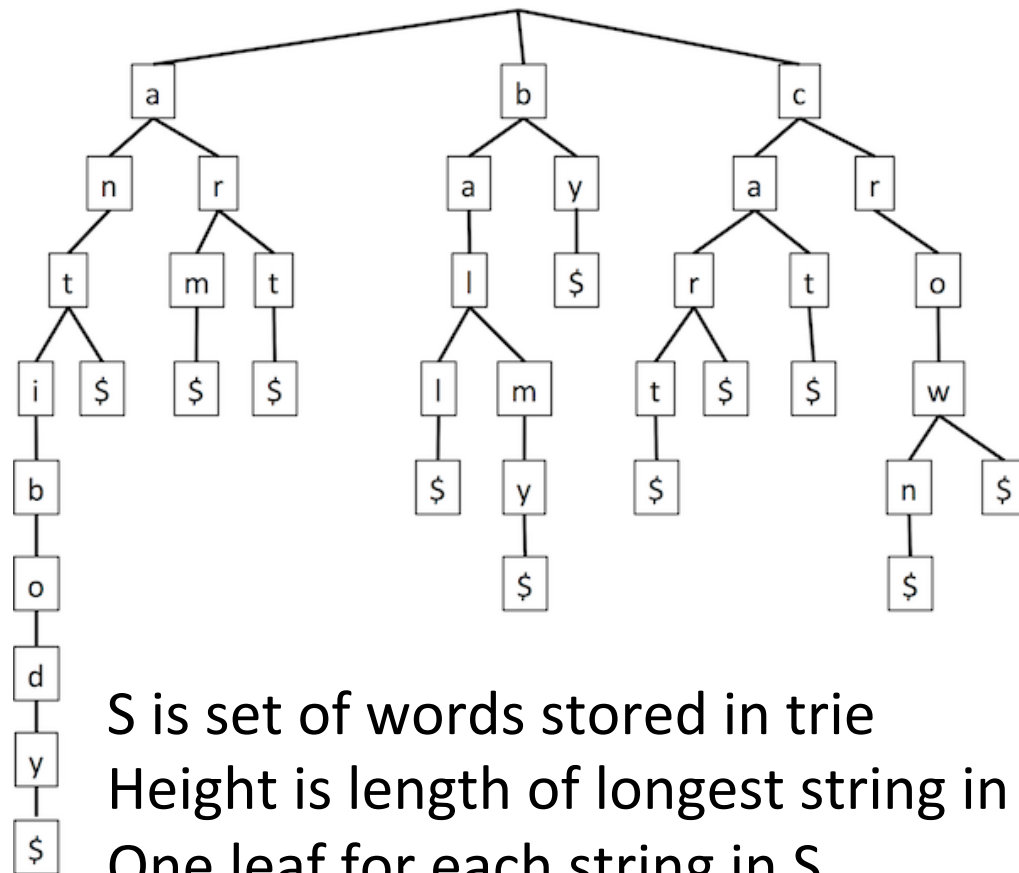


2. Tries

3. Suffix tries

Tries can find all substrings in text that begin with a search string in $O(dn)$

Alphabet of d characters, and string length n

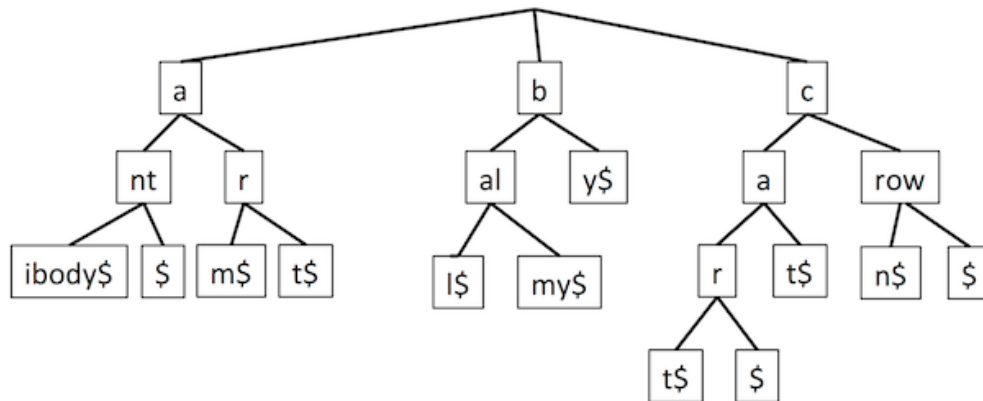


S is set of words stored in trie
Height is length of longest string in S
One leaf for each string in S
Can be used for Set or Map

- Trie is pronounced “Try” (from retrieve)
- Multi-way tree
- Each node is a letter in the text to be searched
- To match string, start at root and follow children to first letter
- Repeat for next letter until find word or stop character (\$ here)
- To find string of length n , must go down n levels
- If alphabet has d characters $O(dn)$ to find or insert ²⁰

Compressed tries save memory

Alphabet of d characters, and string length n



- Compressed trie stores substrings if no branches
- Number of nodes reduced from $O(n)$ to $O(s)$ – number of substrings
- Saves memory, book shows how to store indices
- Not necessarily faster than standard trie, still need to compute desired path
- Can be used for sorting
 - Add all words into trie
 - Do a pre-order traversal

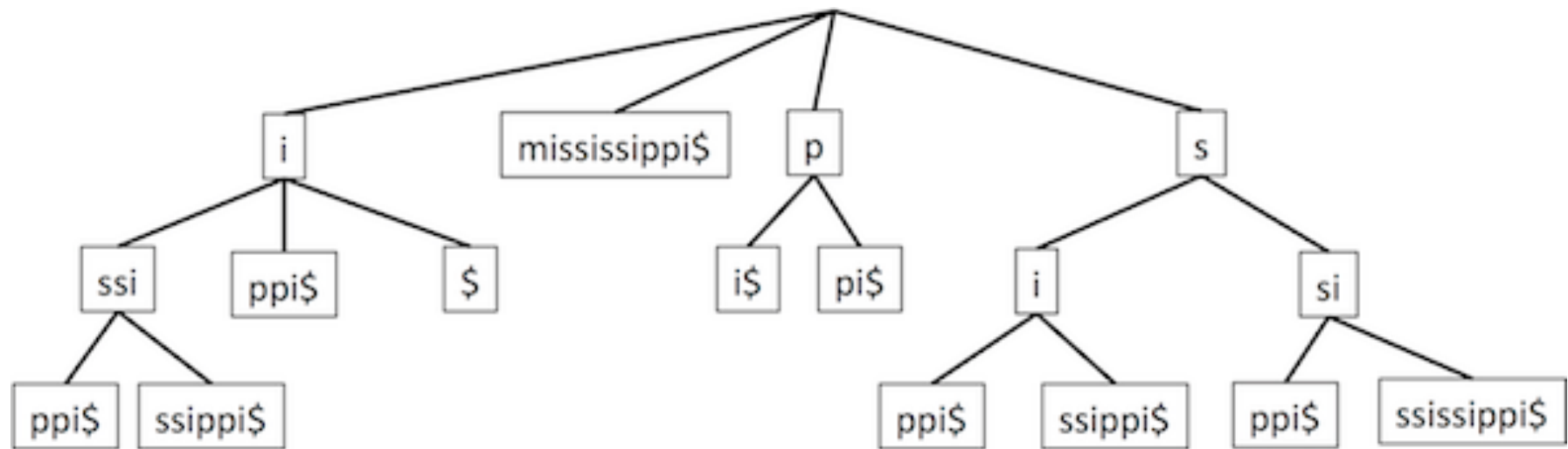
Agenda

1. Boyer-Moore algorithm

2. Tries

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Tries works on prefixes, we can also work on suffixes with a Suffix trie



- Store data by suffixes (end of words)
- Add node for each substring $X[j..n-1]$, for $j=0,1,..n-1$
- Use compressed trie (algorithm complicated, stores in $O(n)$ time)
- Search for suffixes, start at root and work downward

You've come a long way in 10 weeks!

- You learned Java on your own
- Objects? No problem!
- ADTs:
 - Lists, Maps, Stacks, Queues, Trees, Graphs,...
- Data structures:
 - Arrays, Linked Lists, Trees, Hash Tables
- Advanced data structures/algorithms
 - 2-3-4 and Red-Black trees, Tries, Boyer-Moore
- Cutting-edge applications
 - Video processing, data compression, large graph traversal, pattern matching and pattern recognition

In my estimation, you are here

