

COT 6936: Topics in Algorithms

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http://www.cs.fiu.edu/~giri/teach/COT6936_S10.html
<https://online.cis.fiu.edu/portal/course/view.php?id=427>

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The String Matching Problem



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Approximate String Matching

Input: Text T , Pattern P

Questions:

Many more variants

Does P occur in T ?

Find one/all occurrence of P in T .

Count # of occurrences of P in T .

Find longest substring of P in T .

Find closest substring of P in T .

Locate direct repeats of P in T .

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String Matching Algorithms

- Find all occurrences of **P** in **T**.
 - Naïve Method
 - Rabin-Karp Method
 - FSA-based method
 - Knuth-Morris-Pratt algorithm
 - Boyer-Moore
 - Suffix Tree method
 - Shift-And method
 - Suffix Arrays
 - Methods based on Burrows-Wheeler transform

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Naïve Strategy

ATAQANANASPVANAGVERANANESISITALVDANANANANAS
FFFFF ANANAS ANANAS ANANAS AN ANANAS

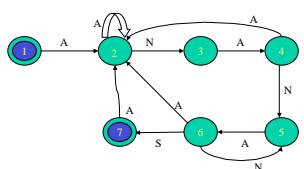
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Finite State Automata

ANANAS
Finite State Automaton



ATAQANANASPVANAGVERANANESISITALVDANANANANAS

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State Transition Diagram

		A	N	S	*
-	0	1	0	0	0
A	1	1	2	0	0
AN	2	3	0	0	0
ANA	3	1	4	0	0
ANAN	4	5	0	0	0
ANANA	5	1	4	6	0
ANANAS	6	1	0	0	0

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Sliding Window Strategies

```

Initialize window on T;
While (window within T) do
    Scan: if (window = P) then report it;
    Shift: shift window to right (by ?? positions)
endwhile;
```

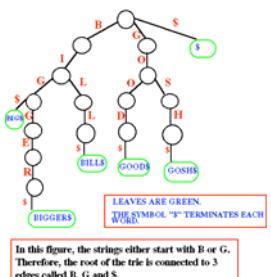
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Tries

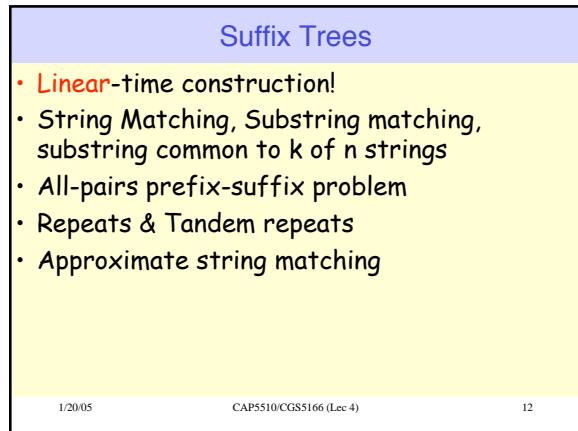
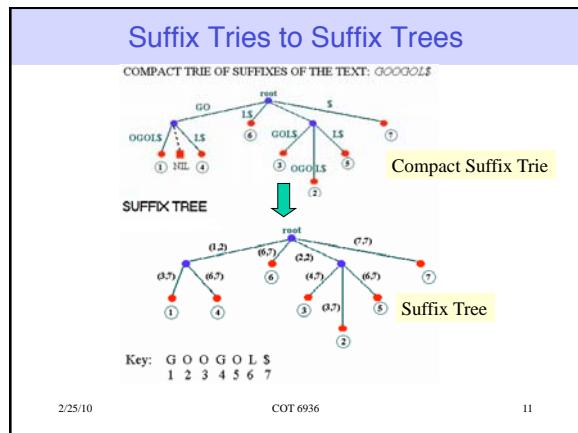
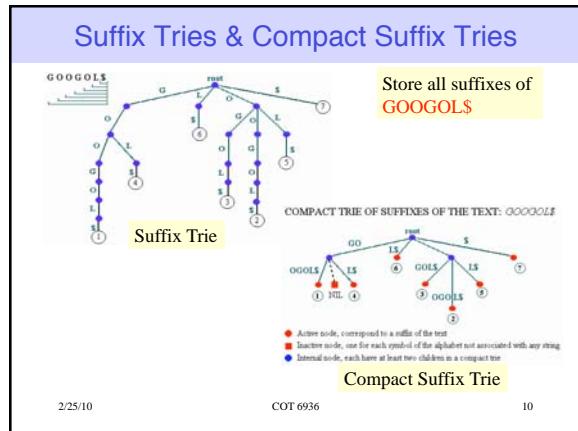
Storing:
BIG
BIGGER
BILL
GOOD
GOSH



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CAPS510/CGS5166 (Lec 4)

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```

123456789012
abracadabra$  

12 $  

11 a$  

8 abra$  

1 abracadabra$  

4 acadabra$  

6 adabra$  

9 bra$  

2 bracadabra$  

5 cadabra$  

7 dabra$  

10 ra$  

3 racadabra$  


```

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Search **abr** (len = m)

- Binary Search in suffix array
- $O(\log n)$ string comparisons
- Each comparison may involve comparing $O(m)$ characters
- $O(m + \log n)$ search
- $O(n \log n)$ space

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Suffix Array & BWT Coding

123456789012	12345678901
abracadabra	abracadabra
12 \$	12 \$ abracadabra
Space: $n \log n + O(n)$	Space: $n + O(A) + o(n)$
Search: $O(m + \log n)$	Search: $O(m)$
11 a\$	11 a\$ abracadab
8 abra\$	8 abra\$ braca
1 abracadabra\$	1 abracadabra\$ bra
4 acadabra\$	4 acadabra\$ abrac
6 adabra\$	6 adabra\$ abrac
9 bra\$	9 bra\$ abracada
2 bracadabra\$	2 bracadabra\$ a
5 cadabra\$	5 cadabra\$ abra
7 dabra\$	7 dabra\$ abra
10 ra\$	10 ra\$ abracada
3 racadabra\$	3 racadabra\$ ab

L

- L is the BWT Code
- L is more compressible than the original input T

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BWT Decoding: Step 1

Step 1: Compute F from L

```

F          L
12 $abracadabra
11 a$abracadab
8 abra$abracad
1 abracadabras
4 acadabras$ab
6 adabras$abrac
9 bra$abracada
2 bracadabras$ab
5 cadabras$abra
7 dabras$abrac
10 ra$abracadab
3 racadabras$ab

```

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BWT Decoding: Step 2

Step 2: Compute the LF Mapping, i.e., $F[LF[i]] = L[i]$

```

F          L
12 $abracadabra
11 a$abracadab
8 abra$a$abracad
1 abracadabra$
4 acadabra$abr
6 adabra$a$abrac
9 bra$a$abracada
2 bracadaabra$a
5 cadabra$a$abra
7 dabra$a$abrac
10 ra$a$abracadab
3 racadabra$a$ab

```

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BWT Decoding: Step 3

Step 3: Reconstruct original input

```

F          L
12 $abracadabra
11 a$abracadab
8 abra$a$abracad
1 abracadabra$
4 acadabra$abr
6 adabra$a$abrac
9 bra$a$abracada
2 bracadaabra$a
5 cadabra$a$abra
7 dabra$a$abrac
10 ra$a$abracadab
3 racadabra$a$ab

```

LF mapping gives you previous character for $L[i]$

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Backward Search

Backward step 1: search for "a"		
Backward step 2: search for "la"		
Backward step 3: search for "ala"		
i: A[i] T _{A[i],1} suffix T _{A[i],n}	i: A[i] T _{A[i],1} suffix T _{A[i],n}	i: A[i] suffix T _{A[i],n}
1: 21 a \$	1: 21 a \$	1: 21 \$
2: 7 r _a_la_abarda\$	2: 7 r _a_la_abarda\$	2: 7 _a_la_abarda\$
3: 12 a _alabarda\$	3: 12 a _alabarda\$	3: 12 _alabarda\$
4: 9 a _la_abarda\$	4: 9 a _la_abarda\$	4: 9 _la_abarda\$
5: 20 d _alabarda\$	5: 20 d _alabarda\$	5: 20 _alabarda\$
6: 11 r _a_la_abarda\$	6: 11 r _a_la_abarda\$	6: 11 a_la_abarda\$
7: 8 _a_la_abarda\$	7: 8 _a_la_abarda\$	7: 8 a_la_abarda\$
8: 3 _l_abar_a_la_abarda\$	8: 3 _l_abar_a_la_abarda\$	8: 3 abar_a_la_abarda\$
9: 15 l abarda\$	9: 15 l abarda\$	9: 15 abarda\$
10: 1 \$ alabar_a_la_abarda\$	10: 1 \$ alabar_a_la_abarda\$	10: 1 alabar_a_la_abarda\$
11: 16 a bar_a_la_abarda\$	11: 16 a bar_a_la_abarda\$	11: 16 bar_a_la_abarda\$
12: 5 b ar_a_la_abarda\$	12: 5 b ar_a_la_abarda\$	12: 5 ar_a_la_abarda\$
13: 17 b orda\$	13: 17 b orda\$	13: 17 orda\$
14: 4 a bar_ar_a_la_abarda\$	14: 4 a bar_ar_a_la_abarda\$	14: 4 bar_a_la_abarda\$
15: 16 a barda\$	15: 16 a barda\$	15: 16 barda\$
16: 10 r da\$	16: 10 r da\$	16: 10 da\$
17: 10 la_abarda\$	17: 10 la_abarda\$	17: 10 la_abarda\$
18: 2 a labar_a_la_abarda\$	18: 2 a labar_a_la_abarda\$	18: 2 labar_a_la_abarda\$
19: 14 a labarda\$	19: 14 a labarda\$	19: 14 labarda\$
20: 6 a r_a_la_abarda\$	20: 6 a r_a_la_abarda\$	20: 6 r_a_la_abarda\$
21: 18 a roda\$	21: 18 a roda\$	21: 18 roda\$

Fig. 4. Backward search for pattern "ala" on the suffix array of the text "alabar_a_la_abarda\$". Here A is drawn vertically and the suffixes are shown explicitly, compare to Fig. 3.

Backward Search

```
Algorithm count( $P[1, p]$ )
(1)  $i \leftarrow p$ ,  $c \leftarrow P[p]$ , First  $\leftarrow 1$ , Last  $\leftarrow n$ ;
(2) while ((First  $\leq$  Last) and ( $i \geq 1$ )) do
(3)    $c \leftarrow P[i]$ ;
(4)   First  $\leftarrow C[c] + \text{Occ}(c, \text{First} - 1) + 1$ ;
(5)   Last  $\leftarrow C[c] + \text{Occ}(c, \text{Last})$ ;
(6)    $i \leftarrow i - 1$ ;
(7) if (Last < First) then return "no rows prefixed by  $P[1, p]$ " else return (First, Last).
```

Fig. 3. Algorithm count for finding the set of rows prefixed by $P[1, p]$, and thus for counting the pattern occurrences $\text{occ} = \text{Last} - \text{First} + 1$. Recall that $C[c]$ is the number of text characters which are alphabetically smaller than c , and that $\text{Occ}(c, q)$ denotes the number of occurrences of character c in $T^{\text{bwt}}[1, q]$.

Backward Search

Need 2 mappings:

- $C: \Sigma \rightarrow [1, n]$ EASY
 - $\text{Occ}: \Sigma \times [1, n] \rightarrow [1, n]$ NON-TRIVIAL
-
-
-
-
-
-
-

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Rank Query

Need to answer rank queries:

$\text{Occ}(c, L, i)$: # of occurrences of c in $L[1..i]$

- Compute a bit sequence B_c
 - 1, if corresponding character is c
 - 0, otherwise
 - Computing Occ is reduced to computing number of 1's in B_c until position i
-
-
-
-
-
-
-

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Rank Query

Need to answer rank queries:

$\text{Occ}(1, B, i)$ in $O(1)$ time with the minimal amount of space.

This is sufficient because:

- $\text{Occ}(1, B, i) = i - \text{Occ}(0, B, i)$
- Can be easily generalized to non-binary case using [Wavelet Trees](#)

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Wavelet Trees

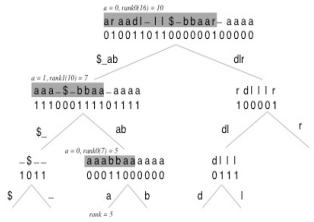


Fig. 5. A binary wavelet tree for the string $L = "araad1_ll$bbaar_aaaa"$, illustrating the solution of query $\text{Occ}("a", 15)$. Only the bit vectors are stored, the texts are shown for clarity.

Huffman-based Wavelet Trees

- Binary tree in the wavelet tree can be replaced with a [Huffman-based tree](#), i.e., more frequent characters are placed at shallower leaves.

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Rank query: binary sequences

Use a 2-level dictionary

- Chop into short sequences (of length $k = (\log n)/2$) and store solutions of ranks at regular intervals
- Store global table with answers for every possible short sequence. This table is of size $\sqrt{n} \times k$

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