CS 7280: Data Str and Algs for Scalable Computing

Spring 2025

Lecture 6 — January 29, 2025

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## 1 Overview

#### Recap:

Discussing string inputs which could vary in universe size depending on the alphabet. Our goal is to be able to find matches of a pattern P in a string T, using **very little space and very quickly** 

#### String Matching:

- Text T and Pattern  $P = Strings \text{ over } \Sigma \text{ alphabet}$
- $\bullet$  Goal: Find all occurrences of P in T, with location and number of occurrences

Methods we've covered so far.

- Brute Force with rolling hash (slightly better): O(T) time complexity.
- Tries: Space = Array, BST, Hash Table,... and efficient queries.
- Suffix Trees: O(P) query time, O(T) space.
- Suffix Arrays:  $O(P \log T)$  query time, O(T) space.
- FM-index: A compressed representation using the Burrows-Wheeler Transform (BWT).

#### Human Genome Example:

- |T| = 3 Billion
- $|\Sigma| = 4$  (A,C,T,G)
- Suffix Tree = about 47GB
- Suffix Array = about 12GB
- FM-index = about 1.5GB

### 2 FM-index

The FM-index ([1]) uses indexes which combine the BWT with some small auxiliary data structures. The core of the the index consists of F and L columns from the BW-Matrix.

## 2.1 Key Components

- F: First column (sorted characters of the text).
- $\bullet$  L: Last column from the BWT matrix.

| idx | F     | L         |
|-----|-------|-----------|
| 0   | \$    | <br>$a_0$ |
| 1   | $a_0$ | <br>$b_0$ |
| 2   | $a_1$ | <br>$b_1$ |
| 3   | $a_2$ | <br>$a_1$ |
| 4   | $a_3$ | <br>\$    |
| 5   | $b_0$ | <br>$a_2$ |
| 6   | $b_1$ | <br>$a_3$ |

Table 1: F and L

## 2.2 Pattern Matching with FM-Index

- T = abaaba\$
- $\bullet$  P = aba
- Store F as  $|\Sigma|$  indexes
- Try to find P within T by using F and L ...
  - Mapping from  $\$ \to a_0$ , then checking for  $a_0$  in F to find the next predecessor in T
  - repeat the process...
  - With this, find the pattern match.

In order to find ALL occurrences of P, use index of CLUSTERS of similar characters in F

## 2.3 ISSUES

- 1. SLOW: if we scan characters in L, it is very slow.
  - O(m) time
  - (m = |L|)
- 2. Storing ranks takes too much space
- 3. Doesn't find WHERE the matches occur in T

#### 2.4 SOLUTIONS

- 1. IDEA 1: Is there O(1) way to determine which b's preceded the a's in our range?
  - Pre-calculate number of a's and b's in L up to every row.
  - Space = m \*  $|\Sigma|$

|   | idx | a | b |
|---|-----|---|---|
|   | 0   | 1 | 0 |
|   | 1   | 1 | 1 |
|   | 2   | 1 | 2 |
| • | 3   | 2 | 2 |
|   | 4   | 2 | 2 |
|   | 5   | _ | 2 |
|   | 6   | 4 | 2 |

- $\bullet$  index 0 and 5: a precedes b
- 2. IDEA 2: If Suffix Array was part of the index, we can simplify, by looking up the offset.
  - Suffix Array takes O(T) space.
- 3. IDEA 3: SPARSIFY
  - Only store SOME rows, every fraction.
  - EXAMPLE:

| • | idx | a | b |
|---|-----|---|---|
|   | 0   | 1 | 0 |
|   | 3   | 2 | 2 |
|   | 6   | 4 | 2 |

- The size between each "Checkpoint" row should be small enough for intermediate information to be accessed with a linear scan in efficient time.
- FM-index Space: Human Genome Example
  - F: about  $|\Sigma|$  integers  $\rightarrow$  16 Bytes
    - \* 16 Bytes = 4 Bytes (per integer) \* 4 letters
  - L: m characters  $\rightarrow$  750 megabytes
    - \* 750 megabytes = 6 Billion bits (each letter as 2 bits, 2 \* 3 billion) / 8 = 750k Bytes
  - Suffix Array Sample: m \* a (fraction a = 1/32)  $\rightarrow 400$  megabytes
    - \* 400 megabytes =  $\frac{3billion*4}{32}$
  - Checkpoint Tally: m \*  $|\Sigma|$  \* b (fraction b = 1/128)  $\rightarrow$  100 megabytes
    - \* 100 megabytes =  $\frac{3billion*4*4}{128}$
  - TOTAL: about 1.5 GB

# 3 Hashing: Balls and Bins preview

## 3.1 Probability Analysis

How many tosses of a 50/50 coin to have at least 1 heads result?

## • WITH HIGH PROBABILITY:

- $P[E] = 1 \frac{1}{n^c}$ , n = number of events
- $\lim_{x\to\inf} f(x) \to 1, c \ge 1$
- What order of "n" will be needed for high probability?

C value for at least one head:

- $P[\text{no head}] = \frac{1}{2}$ , for one toss
- $P[\text{no head in "i" tosses}] = \frac{1}{2^i}$
- $i = 3lg(n) \rightarrow \frac{1}{2^{3lgn}} \rightarrow \frac{1}{n^3}$  ... so
- $P[\text{at least one head in n}] = 1 P[\text{no head in "i" tosses}] = 1 \frac{1}{n^3}$

# References

[1] Paolo Ferragina and Giovanni Manzini. Opportunistic data structures with applications. *FOCS*, 20000.