## CS342: Bioinformatics Lecture 3

## DNA Sequence Data



## The Cancer Genomics Hub mission is now completed.

The Cancer Genomics Hub was established in August 2011 to provide a repository to The Cancer Genome Atlas, the childhood cancer initiative Therapeutically Applicable Research to Generate Effective Treatments and the Cancer Genome Characterization Initiative.

CGHub rapidly grew to be the largest database of cancer genomes in the world, storing more than 2.5 petabytes of data and serving downloads of nearly 3 petabytes per month.

## DNA Sequence Data

Harmonized Cancer Datasets
Genomic Data Commons Data Portal Get Started by Exploring:

| ■ Projects | Exploration | A Analysis |
| :---: | :---: | :---: |


| Q e.g. BRAF, Breast, TCGA-BLCA, TCGA-A5-A0G2 |  |  |
| :---: | :---: | :---: |
| Data Portal Summary Data Release 10-December 21, 2017 |  |  |
| PROJECTS $\square$ 40 | PRIMARY SITES 60 | $e_{32,555}^{\text {CASES }}$ |
| FILES | genes | mutations |
| 310,859 | 22,147 | -1. $3,142,246$ |

## Cases by Major Primary Site


https://gdc.cancer.gov/

## DNA Sequence Data

## European Genome-phenome Archive

```
All v
```

Examples: EGAS00000000001, Cancer
Search

| EGA home | About | Studies | Datasets |
| :--- | :--- | :--- | :--- |

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## DNA Sequence Data

PCAWG
PanCancer Analysis OFWHOLE GENOMES

| Cancer projects | 76 |
| :--- | ---: |
| Cancer primary sites | 21 |
| Donors with molecular data in DCC | 17,440 |
| Total Donors | 20,383 |
| Simple somatic mutations | $68,194,271$ |
| Mutated Genes | 57,668 |

The Pancancer Analysis of Whole Genomes (PCAWG) study is an international collaboration to identify common patterns of mutation in more than 2,800 cancer whole genomes from the International Cancer Genome Consortium.
$130 \mathrm{~GB} \times 2$ files $\times 2,800$ patients $=728,000 \mathrm{~GB}$ $=728 \mathrm{~TB}$

## DNA Sequence Data



## Exact Pattern Matching Problem

Input: Two strings, (1) a pattern $p=p_{1} p_{2} \ldots p_{n}$ and (2) a larger text $t=t_{1} t_{2} \ldots t_{m}$ Output: All positions i, $1 \leq i \leq m-n+1$, such that $t_{i} \ldots t_{i+n-1}=p_{1} \ldots p_{n}$.

Example: $\mathrm{t}=$ banana and $\mathrm{p}=a n$

## Multiple Pattern Matching Problem

Input: A set of $k$ patterns $\mathrm{p}_{1}, \mathrm{p}_{2}, \ldots, \mathrm{p}_{\mathrm{k}}$, and a larger text $t=t_{1} t_{2} \ldots t_{m}$. Output: All positions $1 \leq i \leq m$, such that the substring starting at $t_{i}$ matches $p_{j}$ for $1 \leq j \leq k$.
Example: $\mathrm{t}=$ banana, $\mathrm{p}_{1}=a n, \mathrm{p}_{2}=n a n$

## Keyword Trees

Def: data structure for representing a collection of strings

- Supports fast pattern matching
- Rooted tree
- Each edge is labeled with a single letter
- Two edges out of a vertex must have different labels
- Every keyword is spelled on a path from root to leaf


## Multiple Pattern Matching Problem

Input: A set of $k$ patterns $\mathrm{p}_{1}, \mathrm{p}_{2}, \ldots, \mathrm{p}_{\mathrm{k}}$, and a larger text $t=t_{1} t_{2} \ldots t_{m}$. Output: All positions $1 \leq i \leq m$, such that the substring starting at $t_{i}$ matches $p_{j}$ for $1 \leq j \leq k$.
Example: $\mathrm{t}=$ banana, $\mathrm{p}_{1}=a n, \mathrm{p}_{2}=$ nan

Questions: [think, pair, share]

1. Does the keyword tree solve the multiple pattern matching problem? Why?
2. What happens if a pattern is a prefix of another pattern?

## Multiple Pattern Matching with Keyword Trees

Runtime? Assume $N$ is sum of lengths of patterns, $m$ is the length of the text, and $n$ is length of longest pattern

$$
O(N+n m)
$$

Question: Is this better than brute force? [Think, pair, share]

