# CS 4800: Algorithms & Data Lecture 11

February 16, 2018

# Comparing genomes

- Given 2 strings/genes
  - $X = x_1 x_2 \dots x_m$
  - $Y = y_1 y_2 \dots y_n$





- Find alignment of X and Y with min cost
  - Each position in X or Y that is not matched cost 1
  - For each pair of letters p, q, matching p and q incurs mismatch cost of a<sub>p,q</sub>



# Subproblems

 Best(i, j): minimum alignment cost for 2 strings x<sub>i</sub>, ..., x<sub>m</sub> and y<sub>j</sub>, ..., y<sub>n</sub>



# Guess to align x[i:] and y[j:]



- How to align first characters?
- 3 possibilities:
  - Match x<sub>i</sub> and y<sub>i</sub>
  - x<sub>i</sub> not matched
  - y<sub>j</sub> not matched

#### Recursive relation

• 
$$Best(i,j) = \min \begin{cases} a_{x_i,y_j} + Best(i+1,j+1) \\ 1 + Best(i+1,j) \\ 1 + Best(i,j+1) \end{cases}$$

 Evaluation order: from large i to small i, from large j to small j

# Whole algorithm

- Initialize
  - Best(m + 1, n + 1) = 0 // aligning 2 empty strings
  - Best(m + 1, j) = n j + 1 for j from 1 to n
  - Best(i, n + 1) = m i + 1 for i from 1 to m
- For i from m down to 1
  - For j from n down to 1

• 
$$Best(i,j) = \min \begin{cases} a_{x_i,y_j} + Best(i+1,j+1) \\ 1 + Best(i+1,j) \\ 1 + Best(i,j+1) \end{cases}$$

• Return Best(1,1)

# Greedy algorithms

Files on tape

#### Tape storage

- n files of lengths L<sub>1</sub>, L<sub>2</sub>, ..., L<sub>n</sub>
- To access a file on tape, need to scan pass all previous files



 Want an ordering to store the tape files to minimize then time to access a random file

#### Precise objective

- Say the file are stored according to permutation  $\pi$ 



- Time to access the i-th file is  $\overline{\sum_{j=1}^{i} L_{\pi(j)}}$
- Expected accessing time of a random file is

$$cost(\pi) = \frac{1}{n} \sum_{i=1}^{n} \sum_{j=1}^{l} L_{\pi(j)}$$

# Example

File 1	File 2	File 3
10	5	15

- Time to access file 1: 10
- Time to access file 2: 15
- Time to access file 3: 30
- Expected accessing time:  $\frac{1}{3}(10 + 15 + 30) = 18.33$

# Better ordering



- Swap files 1 and 2
- Time to access file 2: 5
- Time to access file 1: 15
- Time to access file 3: 30
- Expected accessing time:  $\frac{1}{3}(5 + 15 + 30) = 16.67$

#### Greedy strategy

• Order the files in non-decreasing sizes

# Exchange argument

Claim.  $cost(\pi)$  is minimized when  $L_a \leq L_b$  for all pairs of consecutive files a and b in the ordering.

Proof.

Suppose  $L_a > L_b$  for some consecutive files *a* followed by *b*.

If swap *a* and *b*,

- Cost of accessing *a* increase by L<sub>b</sub>
- Cost of accessing b decrease by L<sub>a</sub>

Overall, average accessing cost change by  $(L_b-L_a)/n$ 

 $L_b < L_a$  so the average accessing cost decreases.

Thus, can improve accessing time whenever there is a consecutive pair with decreasing sizes



# Non-uniform frequencies

- File i is accessed F<sub>i</sub> times
- Want to minimize total access time

$$\cos t(\pi) = \sum_{i=1}^{n} \left( F_{\pi(i)} \sum_{j=1}^{i} L_{\pi(j)} \right)$$

# Example

File 1	File 2	File 3
size: 5	size: 2	size: 8
freq: 2	freq: 1	freq: 5

- Time to access file 1: 5
- Time to access file 2: 7
- Time to access file 3: 15
- Total accessing time:  $2 \cdot 5 + 1 \cdot 7 + 5 \cdot 15 = 92$

# Better ordering

File 3	File 2	File 1
size: 8	size: 2	size: 5
freq: 5	freq: 1	freq: 2

- Time to access file 3: 8
- Time to access file 2: 10
- Time to access file 1: 15
- Total accessing time:  $5 \cdot 8 + 1 \cdot 10 + 2 \cdot 15 = 80$

# Greedy algorithm

• Sort the files by the ratio Length/Freq.

Exchange argument

Claim.  $cost(\pi)$  is minimized when  $L_a/F_a \leq L_b/F_b$  for all consecutive pair of files a followed by b.

Proof. Suppose  $\frac{L_a}{F_a} > \frac{L_b}{F_b}$  for some consecutive files a followed by b.

If swap a and b,

- Cost of accessing a increase by L<sub>b</sub>
- Cost of accessing b decrease by L<sub>a</sub>

Overall, average accessing cost change by

 $L_b F_a - L_a F_b$ 

<sup>b</sup> so the average accessing cost decreases.

Thus, can improve accessing time whenever there is an out of order pair.



# Scheduling

Movie	Start	End
Blair Witch	10:30	12:00
Bridget Jones's Baby	10:45	12:45
Deepwater Horizon	10:15	12:10
Masterminds	12:30	2:00
Miss Peregrine's	1:15	3:20

#### Problem statement

- n activities
- Start times : s<sub>1</sub>, s<sub>2</sub>, ..., s<sub>n</sub>
- Finish times: f<sub>1</sub>, f<sub>2</sub>, ..., f<sub>n</sub>
- Find largest subset of activities that are compatible



#### Problem statement

- n activities
- Start times : s<sub>1</sub>, s<sub>2</sub>, ..., s<sub>n</sub>
- Finish times:  $f_1 \leq f_2 \leq \cdots \leq f_n$  (sorted)
- Find largest subset of activities that are compatible



# Dynamic Programming

- Best(i): Maximum # compatible activities finishing by f<sub>i</sub>
- Optimal substructure: consider activities comprising Best(i) (e.g. best(5) is {1,2,5})



• Claim. The prefix (e.g.  $\{1,2\}$ ) is optimal choice if restricted to activities finishing before the start of last activity (s<sub>5</sub>).