



# Research Topics in Bioinformatics: Problems related to Bioinformatics



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# Problems related to Bioinformatics

- Challenge: write a program in {C | C++ | CUDA C | assembly language} either in {Windows | Linux} environment
- Challenge:
  - Correctness
  - Fastest execution time

# Problem #1: Counting DNA Nucleotides

- Given: A DNA string  $s$  of length stored in *Fasta* format. Assume there is only one DNA string in the Fasta file (file: ndna\_255.fa).
- Output:
  - Frequency of A
  - Frequency of C
  - Frequency of G
  - Frequency of T
  - Frequency of non-ACGT (usually “N” to denote Not sequence)
  - Total length of the DNA string
- Research Question: What is a Fasta file format?
  - In this format, the string is introduced by a line that begins with '>', followed by some labeling information. Subsequent lines contain the string itself.

# Problem #2: Computing GC content

- Given: A DNA string  $s$  of length stored in *Fasta* format. Assume there is only one DNA string in the Fasta file (file: ndna\_255.fa).
- Output:
  - GC-content of the DNA string
- Research Question: What is GC content?
  - The GC-content of a DNA string is given by the percentage of symbols in the string that are 'C' or 'G'. For example, the GC-content of "AGCTATAG" is 37.5%.

# Problem #3: Transcribing DNA to RNA

- Given: A DNA string  $s$  of length stored in *Fasta* format. Assume there is only one DNA string in the Fasta file (file: ndna\_255.fa).
- Output:
  - The transcribed RNA string of the DNA string
- Research Question: What is RNA?
  - An RNA string is a string formed from the alphabet containing 'A', 'C', 'G', and 'U'
  - Given a DNA string, its transcribed RNA string is formed by replacing all occurrences of "T" with "U"

# Problem #4: Complementing a DNA string

- Given: A DNA string  $s$  of length stored in *Fasta* format. Assume there is only one DNA string in the Fasta file (file: ndna\_255.fa).
- Output:
  - The reverse complement of the DNA string
- Research Question: What is reverse complement?
  - In DNA strings, symbols 'A' and 'T' are complements of each other, as are 'C' and 'G'.
  - The reverse complement of a DNA string is the string formed by reversing the symbols, then taking the complement of each symbol
  - Example: The reverse complement of “GTCA” is “TGAC”

# Problem #5: Counting Point Mutations (hamming distance)

- Given: Given two DNA strings  $s$  and  $t$  of equal length. The two strings are stored in text format (file: Rosalind\_hamm.txt)
- Output:
  - The hamming distance of the two strings
- Research Question: What is hamming distance?
  - Hamming distance – the number of differences at each position of the string. Can be viewed as the number of substitutes to transform from one string to another.
  - Example: The hamming distance of (“GTAGCGGCG”, “GTAACGGCG”) is 1

# Problem #6: Finding a Motif in DNA

- Given: Given two DNA strings  $s$  and  $t$ ,  $t$  is the substring of  $s$  if  $t$  is contained as a contiguous collection of DNA symbols in  $s$  (obvious,  $t$  must be no longer than  $s$ ) The two strings are stored in text format (file: Rosalind\_subs.txt)
- Output:
  - All locations of  $t$  as a substring of  $s$
- Research Question: Finding exact match in a string
  - Example:  
     $s = \text{"GATATATGCATATACTT"}$   
     $t = \text{"ATAT"}$   
    Location: 2 4 10 (assume 1-indexing)



# Problem #7: Enumerating k-mers Lexicographically

- Given: An integer  $k$
- Output:
  - Enumerate all  $k$ -mers of the DNA alphabet {A,C,G,T}
  - Example: 2  
Output: AA, AC, AG, AT, CA,CC, CG, CT, GA, GC, GG, GT, TA, TC, TG, TT
- Research Question: What is  $k$ -mer?
  - K-mer is basically a substring of a string. Given a string  $s = \text{"GATATATGCATATACTT"}$ , we can say that "GATA" is a 4-mer of the string  $s$ ; "CTT" is a 3-mer of the string  $s$ , etc.

# Problem #8: Enumerating overlapping k-mer

- Given: An integer  $k$  and a string  $s$
- Output:
  - Enumerate all overlapping  $k$ -mers of the string  $s$
  - Example:  $s = \text{"GATAT"} , k=3$   
Output: GAT, ATA, TAT
- Research Question: What is  $k$ -mer?
  - K-mer is basically a substring of a string. Given a string  $s = \text{"GATATATGCATATACTT"} ,$  we can say that "GATA" is a 4-mer of the string  $s$ ; "CTT" is a 3-mer of the string  $s$ , etc.

# Problem #9: Edit distance

- Given: Given two DNA strings  $s$  and  $t$  of equal length. The two strings are stored in text format. Assume that all edits {insert | delete | mismatch} has a cost of 1. Hint: use dynamic programming. Ask for user input for  $s$  and  $t$
- Output:
  - The edit distance of two strings
- Research Question: What is edit distance?
  - Please refer to succeeding slides

# Levenshtein distance or edit distance

Levenshtein distance or edit distance – the minimal number of insertions, deletions and substitutions to make two strings equal. Also known as “string matching with **k differences**”

T: GGAAGTAGC–GCGCGTT  
          | | | | | | |  
P:       GTAGC**G**GCG  
(Insertion)

T: GGAAGT**A**GCGGCGTT  
          | | | | | | |  
P:       GT–GCGGCG  
(deletion)

T: GGAAGTAGCGGCGTT  
          | | | | | | |  
P:       GTA**A**CGGCG  
(substitution/mismatch)

# Levenshtein distance or edit distance

- Levenshtein/edit distance can be implemented using:
  - Dynamic programming (DP)  $\rightarrow O(mn)$  time complexity
  - Bit vector algorithm  $\rightarrow O(\left\lceil \frac{m}{w} \right\rceil n)$  time complexity

# Levenshtein distance or edit distance

- Using dynamic programming, two matrices can be used:
  - Matrix  $H$  with size of  $(m+1, n+1)$  is the processing matrix where the distance is computed
  - (optional) Backtrack matrix  $B$  with the size of  $(m+1, n+1)$  is to keep track the changes of the score to determine the sequence alignment

# Levenshtein distance or edit distance

- The DP matrix is calculated as follows:
  1. The first row and column of the DP matrix  $H$  is initialized as follows:

$$\begin{aligned}H[0, j] &= H[0, j - 1] + \sigma \\H[i, 0] &= H[i - 1, 0] + \sigma\end{aligned}$$

Where  $\sigma$  is the gap **cost** (usually +1 in simple edit distance)

# Levenshtein distance or edit distance

- The DP matrix is calculated as follows:

2. The recursion scheme:

$$H[i, j] = \min \begin{cases} H[i-1, j-1] + \delta_i \\ H[i-1, j] + 1 \\ H[i, j-1] + 1 \end{cases}$$
$$\delta_i = \begin{cases} 0, & \text{if } pattern[j] = text[i] \\ 1, & \text{if } pattern[j] \neq text[i] \end{cases}$$

3. The edit distance cost is located in the lower right cell (i.e.,  $H_{m,n}$ )



# Levenshtein distance or edit distance

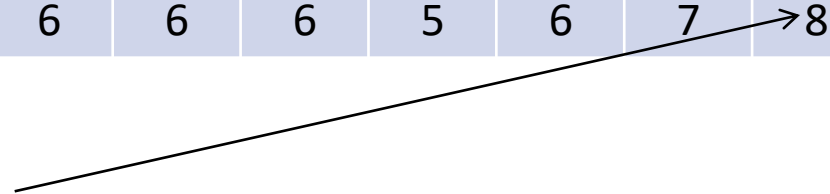
		A	T	G	C	A	T	G	C	C	G	G
	0	1	2	3	4	5	6	7	8	9	10	11
T	1	1										
C	2											
C	3											
G	4											
A	5											
A	6											
A	7											
C	8											

$\min[0+1, 1+(+1), 1+(+1)]$

# Levenshtein distance or edit distance

		A	T	G	C	A	T	G	C	C	G	G
	0	1	2	3	4	5	6	7	8	9	10	11
T	1	1	1	2	3	4	5	6	7	8	9	10
C	2	2	2	2	2	3	4	5	6	7	8	9
C	3	3	3	3	2	3	4	5	5	6	7	8
G	4	4	4	3	3	3	4	4	5	6	6	7
A	5	4	5	4	4	3	4	5	5	6	7	7
A	6	5	5	5	5	4	4	5	6	6	7	8
A	7	6	6	6	6	5	5	5	6	7	7	8
C	8	7	7	7	6	6	6	6	5	6	7	8

Edit distance  $[H(m,n)] = 8$



# Levenshtein distance or edit distance

		A	T	G	C	A	T	G	C	C	G	G
	0	0	0	0	0	0	0	0	0	0	0	0
T	0	3	3	2	2	2	2	2	2	2	2	2
C	0	1	1	3	3	2	2	2	2	2	2	2
C	0	1	1	1	3	2	2	2	3	2	2	2
G	0	1	1	3	1	3	2	3	2	2	3	2
A	0	3	1	1	1	3	2	1	3	2	1	3
A	0	1	3	1	1	1	3	2	1	3	2	1
A	0	1	1	1	1	1	1	3	2	1	3	2
C	0	1	1	1	3	1	1	1	3	2	2	2

Backtrack array: 1-means up 2-means left; 3-means diagonal

-TCCGAAAC---

ATGC-ATGCCGG

Edit distance = 8