### **Prezentácie**

- 9.5. Hozza, Zajacová, Anderle
- 15.5. Ruhalovský, Hajdin, Gibaštíková
- 16.5. Janočko, Herencsár, Žák

Prineste si pdf na USB kľúči alebo vlastný počítač, rady k prezentácii na stránke

# **Shortest common superstring**

Input:  $S_1, S_2, \ldots, S_k \in \Sigma^*$ 

**Goal:** Shortest string S such that each  $S_i$  is a substring of S.

### **Greedy approximation algorithm**

- 1. remove words which are substring of another word
- 2. find words  $S_i$  and  $S_j$  with longest overlap, i.e. longest  $\alpha$  such that  $S_i=\beta\alpha$ ,  $S_j=\alpha\gamma$  for some  $i\neq j$
- 3. connect  $S_i$  and  $S_j$  to  $\beta \alpha \gamma$
- 4. repeat steps 2 and 3 until only one word left

## **Efficient implementation**

- Given  $S_i$  and its suffix tree and given  $S_j$ , find longest prefix of  $S_j$  which is a sufix of  $S_i$
- Given a suffix tree for  $S_1, \ldots, S_k$ , and  $S_j$  find longest prefix of  $S_j$  which is a suffix of some  $S_i$ ,  $i \neq j$
- Find largest overlap
- Running time of the whole algorithm?

Number of strings k Total length of string  $n = \sum_{i=1}^k |S_i|$ 

# Multiple sequence alignment (viacnásobné zarovnanie)

### Align several sequences

```
Human
          ctccatagcaatgt-cagagatagggcagagcggat-----ggtggtgac
  Rhesus
          ctccatggcaatgt-cagagatagggcagagcggat-----gctggtgac
          ttt--tgacaaca--tagagac-tgagatagaaaat----atgctgac
   Mouse
          -tccccgctaatgtacaaagatggggcag-gaaga--a---tgtgctgaa
     Dog
   Horse
          -tccacggcaatac-tggagatggggcagagcaga--agat-ggtgatgaa
Armadillo
          ctqcataqaaatct-caqaqatqqqqqaaaqcaqa----aqacattcat
  Opossum
          atccatggaaacat-cagaagtgggagaaatagaaga----tggcaatga-
 Platypus
          acccggggaagggg-aagaggaagggccggccg------
```

- Hypothesis about evolution:
   all letters in a column evolved from a common ancestor
- Is gap insertion or a deletion?
- Positions that do not change perhaps important

# Score of a multiple alignment

For pairwise alignment, assign score to each column using matrix w(a, b),  $a, b \in \Sigma \cup \{-\}$ .

Different ways how to extend to k sequences

Sum-of-pairs scoring:  $w(A) = \sum_{i < j} d_A(S_i, S_j)$   $d_A(S_i, S_j)$  is cost of alignment of  $S_i$ ,  $S_j$  induced by A (skip columns with two -)

S1: ACAGT-A

S2: A-ACT-C

S3: GCACTGA

$$w(A) = d_A(S_1, S_2) + d_A(S_1, S_3) + d_A(S_2, S_3) = 3 + 3 + 4 = 10$$

## Multiple alignment in practice

- Pruning parts of dynamic programming matrix
  - skip parts that cannot (or are unlikely to) belong to the shortest path
- Progressive alignment
  - successively align pairs of sequences or pairs of alignments
- Anchors
  - find string with approximate occurrences in all input strings
  - align with each other
  - align left and right parts of sequences
- Approximation algorithms

# Motif finding (hľadanie motívov)

**Input:** Strings  $S_1, \ldots, S_k$ , motif length L

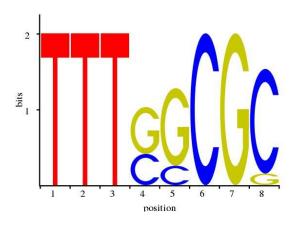
**Goal:** Motif of length L that has (exact/approximate) occurrences in all (or as many as possible) strings  $S_{\hat{\imath}}$ 

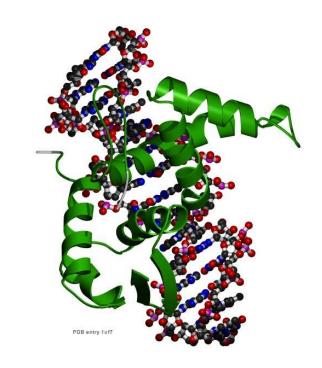
Many formulations depending on definition of

- motif (string, regular expression, scoring matrix)
- motif occurrence (exact, Hamming distance, edit distance, score)
- goal (occurrences in all/many sequences, strength of the motif)

# **Motif finding in bioinformatics**

- Motif occurrences: places where proteins bind DNA
- Motif corresponds to binding preferences of a protein
- Example: transcription factor E2F1
  - regulates cell cycle
  - binds e.g. TTTCCCGC, TTTCGCGC





Experimentally get approximate positions of binding sites
 Discover motif common to many such sites

### **Problem 1**

Motif = string of length L, exact occurrences

Input: Strings  $S_1, \ldots, S_k$ , motif length L

**Output:** A string S of length L that occurs as a substring in the highest number of sequences from  $\{S_1, S_2, \ldots, S_k\}$ .

How to do this efficiently?

#### **Problem 2: Consensus Pattern Problem**

Allow approximate occurrences, consider Hamming distance, require an occurrence in each  $S_i$ .

**Input:** Strings  $S_1, \ldots, S_k$ , motif length L

**Output:** A string S and occurrences  $i_1, \ldots, i_k$  minimizing

$$c(S, i_1, ..., i_k) = \sum_{j=1}^k d_H(S, S_j[i_j ... i_j + L - 1]).$$

### **NP-hard problem**

### We can compute in polynomial time:

For given  $i_1, \ldots, i_k$ , compute  $\min_S c(S, i_1, \ldots, i_k)$ 

For a given S, compute  $\min_{i_1,...,i_k} c(S,i_1,\ldots,i_k)$ 

#### **Problem 2: Consensus Pattern Problem**

## Simple algorithm

For each substring S of length L in  $S_1,\ldots,S_k$ : compute  $c_S=\min_{i_1,\ldots,i_k}c(S,i_1,\ldots,i_k)$  Choose S with the smallest  $c_S$ 

**Theorem.** This algorithm has approximation ratio at most 2.

### **Heuristic iterative improvement:**

for a set of occurrences  $i_1, \dots i_k$  find best S for this S find best occurrences  $i_1, \dots i_k$ 

#### **Problem 2: Consensus Pattern Problem**

## Polynomial-time approximation scheme (PTAS):

For each r-tuple  $(\alpha_1, \ldots, \alpha_r)$ 

where  $\alpha_j$  is a substring of length L of some  $S_i$ :

- compute  $S = arg min_S \sum_j d_H(S, \alpha_j)$
- compute  $c_S = \min_{i_1,\dots,i_k} c(S,i_1,\dots,i_k)$

Choose S with the smallest  $c_S$ 

**Theorem.** This algorithm has approximation ratio at most

$$1+\frac{4\sigma-4}{\sqrt{e}(\sqrt{4r+1}-3)}$$
 and running time  $O(n^{r+1}k^{r+1}L)$ .

# **Problem 3: Closest Substring**

As problem 2, change scoring.

**Input:** Strings  $S_1, \ldots, S_k$ , integers L, k

**Output:** Is there a string S and occurrences  $i_1, \ldots, i_k$  such that

$$d_{H}(S, S_{j}[i_{j}...i_{j} + L - 1]) \le k$$
?

NP-hard problem.

The same 2-approximation algorithm (if each occurrence of distance  $\leq k$  from S, distance to each other  $\leq 2k$ )

### **Closest string problem:**

**Input:** Strings  $S_1, \ldots, S_k$  of the same length L, integer k

**Output:** Is there a string S such that  $d_H(S, S_j) \leq k$ ?

This problem is also NP-hard.