# Lecture 19: Edit Distance

Agenda:

- Scoring schemes in sequence comparison
- Edit distance
- Affine gap penalty scoring scheme

Reading:

• No textbook pages

LCS problem review:

- Definitions: Sequence or String: dynamicprogramming is a sequence over the English alphabet
  - Base/letter/character
  - Subsequence:

the given sequence with zero or more bases left out e.g., dog is a subsequence of dynamicprogramming WARNing: bases appear in the same order, but not necessarily consecutive

- Common subsequence
- LCS problem: given two sequences  $X = x_1x_2...x_n$  and  $Y = y_1y_2...y_m$ , find a maximum-length common subsequence of them.
- The LCS problem has the "optimal substructure" ...
  - if  $x_n$  is NOT in the LCS (to be computed), then we only need to compute an LCS of  $x_1x_2...x_{n-1}$  and  $y_1y_2...y_m$ ...
  - similarly, if  $y_m$  is NOT in the LCS (to be computed), then we only need to compute an LCS of  $x_1x_2...x_n$  and  $y_1y_2...y_{m-1}$  ...
  - if  $x_n$  and  $y_m$  are both in the LCS (to be computed), then  $x_n = y_m$  and we need to compute an LCS of  $x_1x_2...x_{n-1}$  and  $y_1y_2...y_{m-1}$ ; and then adding  $x_n$  to the end to form an LCS for the original problem

#### Sequence Alignment:

- **Definition:** An *alignment* of two sequences  $S_1$  and  $S_2$  is obtained by first inserting spaces, either into or at the ends of  $S_1$  and  $S_2$ , and then placing the two resultant sequences one above the other so that every character or space in either sequence is opposite a unique character or a unique space in the other sequence.
  - An example,  $S_1 = \text{rests}$ ,  $S_2 = \text{stress}$

- - r e s t - s s t r e s - s s

Note: space - is not allowed to be opposite to space -!!!

• Scoring scheme:

For every pair of characters in  $\Sigma \cup \{-\}$ , say a and b, define a score s(a,b) for them to be aligned in one column of the alignment.

- An example scoring scheme LCS:
   s(a, a) = 1, for all a ∈ Σ; otherwise s(a, ·) = 0
- Another notion: distance how much it costs if *a* is replaced by *b*?
- A distance measure (metric) must satisfy 3 conditions:
  - 1. d(a, a) = 0;
  - 2. d(a,b) = d(b,a);
  - 3.  $d(a,b) \le d(a,c) + d(b,c)$ .

## Edit Distance:

- A distance metric which specifies how much it costs to replace letter a by letter b — d(a, b).
- Goal: compute an edit transcript which minimizes the overall cost.
- Again, Edit Distance possesses the *optimal substructure* ... Explain <u>how ???</u>

Letting Edit[i, j] to denote the minimum cost of editing  $S_1[1..i]$  into  $S_2[1..j]$ , then we have the following recurrence:

$$Edit[i, j] = \min \begin{cases} Edit[i - 1, j] + d(S_1[i], -), \\ Edit[i, j - 1] + d(-, S_2[j]), \\ Edit[i - 1, j - 1] + d(S_1[i], S_2[j]) \end{cases}$$

• Base cases ???

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Edit Distance:

- Pseudocode to implement the above recurrence
- Correctness
- Can return an associated Edit Transcript ... trace back
- Running time: Θ(n × m)
   There are n × m entries each takes constant time to compute.
- Space requirement ...  $\Theta(n \times m)$

Can be reduced to  $\Theta(\min\{n, m\})$ 

## Scoring Schemes:

- Edit distance:
  - 1. letter dependent scoring scheme;
  - 2. letter independent scoring scheme: match, mismatch, insertion/deletion (indel)
- An edit transcript ↔ an alignment
   Score/Cost of the alignment is the sum of scores/costs of columns ...
- Now ask: from rests to stress,
  Are r and e deleted separately, or they are deleted at the same time?
  If deleted at the same time, how do we assign a cost for it?
- Or, consecutive spaces should be counted as a gap ...
- Affine gap penalty scoring schemes:
   penalties for a gap: gap opening d<sub>o</sub> and gap extension d<sub>e</sub>
- Now how do we compute an optimal edit transcript? Consider three cases ...

Edit Distance with Affine Gap Penalty Scoring Scheme:

• It still possesses the optimal substructure ...

Letting  $Edit_M[i, j]$  to denote the minimum cost of editing  $S_1[1..i]$  into  $S_2[1..j]$  where the last operation is either a match or a mismatch;

Letting  $Edit_I[i, j]$  to denote the minimum cost of editing  $S_1[1..i]$  into  $S_2[1..j]$  where the last operation is an insertion;

Letting  $Edit_D[i, j]$  to denote the minimum cost of editing  $S_1[1..i]$  into  $S_2[1..j]$  where the last operation is a deletion.

• Recurrence:

$$Edit[i, j] = \min\{Edit_M[i, j], Edit_I[i, j], Edit_D[i, j]\}$$

$$Edit_{M}[i,j] = \widetilde{Edit}[i-1,j-1] + d(S_{1}[i],S_{2}[j]);$$

$$Edit_{I}[i, j] = \min \begin{cases} Edit_{M}[i, j - 1] + d_{o} + d_{e}, \\ Edit_{I}[i, j - 1] + d_{e}, \\ Edit_{D}[i, j - 1] + d_{o} + d_{e} \end{cases}$$

$$Edit_{D}[i, j] = \min \begin{cases} Edit_{M}[i - 1, j] + d_{o} + d_{e}, \\ Edit_{I}[i - 1, j] + d_{o} + d_{e}, \\ Edit_{D}[i - 1, j] + d_{e} \end{cases}$$

Output  $\widetilde{Edit}[n,m]$  !

- Base cases ???
- Running time? Space complexity?

## Lecture 19: Edit Distance

## Have you understood the lecture contents?

well	ok	not-at-all	topic
			sequence alignment
			edit distance
			DP for edit distance
			affine gap penalty scoring scheme
			edit distance with AGPSS
			DP for edit distance with AGPSS