

# Algorithm Design & Analysis (CSE222)

Lecture-11

# Announcement

Raise assignment-1 concerns via google form in gc by today midnight.

# Recap

- Longest Common Subsequence
- Maximum Job
- Edit Distance

# Outline

- Edit Distance
- Weighted Subset

# Levenshtein (Edit) Distance

Given two strings, edit distance measures the number of operations needed to transform one string into another.

## Operations

- Insert
- Replace
- Delete

Input: 'horse' and 'rose'

Replacing 'h' with 'r' results to 'rorse'

Deleting 'r' results to 'rose'.

# Edit Distance

Input: A = horse and B = rose

Case-1: Do nothing

If A[5] equal to B[4]

then transform A[0-4]  $\rightarrow$  B[0-3].

hors      ros

Case-2: Insert

If A[3] not equal to B[3]

then transform A[0-3]  $\rightarrow$  B[0-2].

horr  $\rightarrow$ 

r	o	r
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Case-3: Replace

If A[3] not equal to B[3]

then transform A[0-2]  $\rightarrow$  B[0-2].

hor  $\rightarrow$  ros

Case-4: Delete

If A[3] not equal to B[3]

then transform A[0-2]  $\rightarrow$  B[0-3].

horr  $\rightarrow$  ros

# Edit Distance

Subproblem:  $\text{EDist}(A, B, i, j)$ : Compute the edit distance to transform  $A[0-i] \rightarrow B[0-j]$ .

Recurrence: 
$$\text{EDist}(A, B, i, j) = \begin{cases} \text{EDist}(A, B, i-1, j-1) & \text{if } A[i] == B[j] \\ 1 + \min \begin{cases} \text{EDist}(A, B, i-1, j-1), \\ \text{EDist}(A, B, i-1, j), \\ \text{EDist}(A, B, i, j-1) \end{cases} & \text{else} \end{cases}$$

Final Solution:  $\text{EDist}(A, B, |A|, |B|)$

# Edit Distance

Initialize global matrix  $ed = \{-1\}^{|A| \times |B|}$

Table filling or  
Memoization?

EDIT-DISTANCE( $A, B, i, j$ )

```
1  if ( $A == \text{" "}$ )
2      return  $j$ ;
3  if ( $B == \text{" "}$ )
4      return  $i$ ;
5  if ( $ed(i, j) \neq -1$ )
6      return  $ed(i, j)$ ;
7  else
8      if ( $A[i] == B[j]$ )
9          return  $ed(i, j) = \text{EDIT-DISTANCE}(A, B, i - 1, j - 1)$ ;
10     else
11         insert = EDIT-DISTANCE( $A, B, i, j - 1$ )
12         replace = EDIT-DISTANCE( $A, B, i - 1, j - 1$ )
13         delete = EDIT-DISTANCE( $A, B, i - 1, j$ )
14          $ed[i, j] = 1 + \min\{\text{insert}, \text{replace}, \text{delete}\}$ 
15     return  $ed[i, j]$ 
```

$= ED(A, B, |A|, |B|)$



# Outline

- Edit Distance
- Weighted Subset

# Weighted Subset

Let there are  $n$  items  $\{1, 2, \dots, n\}$  and a weight function  $w: [n] \rightarrow \mathbb{R}_{>0}$ . Let  $W > 0$ .

Goal: Find subset  $S \subseteq \{1, 2, \dots, n\}$  such that  $\sum_{i \in S} w_i \leq W$  and  $\sum_{i \in S} w_i$  is maximum.

Trial-1:

Let  $n = 3$  with weights  $W/2, W/2+1, W/2$ .

Ensure the maximum possible weighted item in the subset.

Sort the item by weights (say  $W/2+1, W/2, W/2$ ).

Trial-2:

Sort the item by weights (say  $W/2, W/2, W/2+1$ ) (It worked!).

Let  $n = 3$  with weights  $1, W/2, W/2$ ?

# Weighted Subset

$$\{ \overset{1}{\cancel{w/2 + 1}}, \overset{2}{w/2}, \overset{3}{\cancel{w/2}} \}$$

Subproblem:  $Wt(i)$ : Optimum weight from first  $i$  elements.

Recurrence (handle cases): At iteration  $n$

$$Wt(n-1)$$

If  $n$  not in optimum then  $Wt(n) = Wt(n-1)$

Else

$$Wt(n) = w_n + \cancel{Wt(n-1)} ?$$

# Weighted Subset

Subproblem:  $Wt(i, T)$ : Optimum weight from first  $i$  elements with weight limited to  $T$ .

Recurrence (handle cases): At iteration  $n$

If  $n$  not in optimum then  $Wt(n, W) = Wt(n-1, W)$

Else

$Wt(n, T) = w_n + Wt(n-1, W - w_n)$ .

$$Wt(i, w) = \max\{Wt(i-1, w), Wt(i-1, w - w_i) + w_i\}$$

Final Solution:  $Wt(n, W)$

# Algorithm

SUBSET-SUM( $W, \{w_1, w_2, \dots, w_n\}$ )

Running time:  $O(nW)$

Memoization?

```
1  for  $i = 0 \dots n$ 
2       $Wt[i, 0] = 0$ 
3  for  $i = 0 \dots W$ 
4       $Wt[0, i] = 0$ 
5  for  $i = 1 \dots n$ 
6      for  $j = 1 \dots W$ 
7          if  $w_i < j$ 
8               $Wt[i, j] = \max\{Wt(n-1, w), Wt(n-1, w - w_n) + w_n\}$ 
9          else
10              $Wt[i, j] = Wt[i-1, j]$ 
11  return  $Wt[n, W]$ 
```

# Problem

Let there are  $n$  items  $\{1, 2, \dots, n\}$ , a weight function  $w: [n] \rightarrow \mathbb{R}_{>0}$  and a value function  $v: [n] \rightarrow \mathbb{R}_{>0}$ . Let  $W > 0$ .

Goal: Find subset  $S \subseteq \{1, 2, \dots, n\}$  such that  $\sum_{i \in S} w_i \leq W$  and the value of the subset is maximum.

# Solution

Define the following

- Subproblem
- Recurrence
- Final Solution
- Algorithm and its running time.

# Reference

Slides

Algorithm design by Kleinberg & Tardos - Chp-6.4