

Edit Distance between two strings is  $\min$  # insertions, deletions, & substitutions of single characters to turn one string into the other.

F $\bar{O}$ O $\bar{D}$   $\rightarrow$  MO $\bar{O}$ D  $\rightarrow$  MO $\bar{N}$  $\bar{D}$   
 $\rightarrow$  MO $\bar{N}$ E $\bar{D}$   
 $\rightarrow$  MONE $\bar{Y}$

E.D. = 4

Levenshtein (coding theory),

Ulam (biological sequences)

Vintsyuk (speech recognition)

Input: two string

$A[1..m], B[1..n]$

Output: Their edit distance.

FOO D  
MONEY Y

Imagine edits by  
stacking strings.  
Each column is  
an edit.

A L G O R I T H M  
A L T R U I S T I C

What should we do for the  
last column?

Use backtracking to try all  
options.

The rest of the columns should represent the edit distance of what remains!

So recursive subproblems are prefixes...

encoded as their final indices (i.e. their lengths)

$Edit(i, j)$ : edit distance for  $A[1..i] + B[1..j]$ .

We want to compute  $Edit(m, n)$ .

Recurrence:

Suppose  $i > 0, j > 0$ . If <sup>optimal</sup> our ↓  
last column is an...

Insertion:



$$\text{Edit}(i, j) = 1 + \text{Edit}(i, j-1)$$

Deletion:



$$\text{Edit}(i, j) = 1 + \text{Edit}(i-1, j)$$

Substitution (?):



$$\text{Edit}(i, j) = \text{Edit}(i-1, j-1) +$$

$$[A[i] \neq B[j]]$$



indicator variable  
= 1 if proposition  
is true &  
0 o.w.

Edit( $i, j$ ) uses min of those  
three expressions.

$$\text{Edit}(0, j) = j$$

$$\text{Edit}(i, 0) = i$$

$$\Rightarrow \text{Edit}(0, 0) = 0$$

$$\text{Edit}(i, j) =$$

$$\begin{cases} j & \text{if } i = 0 \\ i & \text{if } j = 0 \\ \min & \end{cases}$$

$$\begin{cases} 1 + \text{Edit}(i, j-1), \\ 1 + \text{Edit}(i-1, j), \\ [A[i] \neq B[j]] + \text{Edit}(i-1, j-1) \end{cases}$$

O.W.

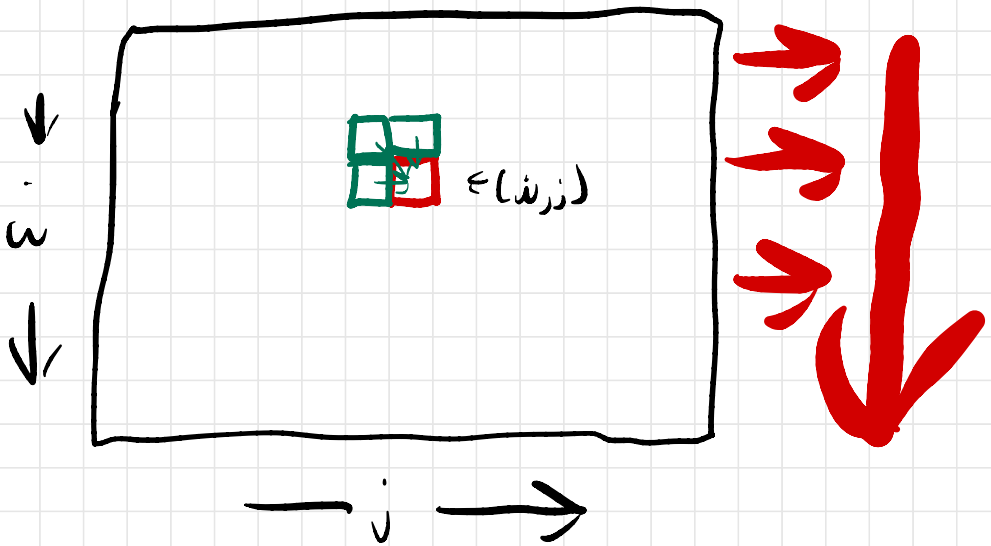
# Dynamic Programming

Subproblems:  $0 \leq i \leq m$   
 $0 \leq j \leq n$

Data structure: 2D Array

Edit[0..m, 0..n]

Dependencies:



Eval order:

Space:  $O(mn)$ . Time:  $O(i) \cdot O(mn)$   
 $= O(mn)$

EDITDISTANCE(A[1..m], B[1..n]):

```

for j ← 0 to n
  Edit[0, j] ← j
for i ← 1 to m
  Edit[i, 0] ← i
  for j ← 1 to n
    ins ← Edit[i, j - 1] + 1
    del ← Edit[i - 1, j] + 1
    if A[i] = B[j]
      rep ← Edit[i - 1, j - 1]
    else
      rep ← Edit[i - 1, j - 1] + 1
    Edit[i, j] ← min {ins, del, rep}
return Edit[m, n]

```

Wagner -  
Fischer '74.

	A	L	G	O	R	I	T	H	M	
	0	1	2	3	4	5	6	7	8	9
A	1	0	1	2	3	4	5	6	7	8
L	2	1	0	1	2	3	4	5	6	7
T	3	2	1	1	2	3	4	4	5	6
R	4	3	2	2	2	2	3	4	5	6
U	5	4	3	3	3	3	3	4	5	6
I	6	5	4	4	4	4	3	4	5	6
S	7	6	5	5	5	5	4	4	5	6
T	8	7	6	6	6	6	5	4	5	6
I	9	8	7	7	7	7	6	5	5	6
C	10	9	8	8	8	8	7	6	6	6

Can trace reasons for each optimal choice to see sequence of edits in  $O(m+n)$  additional time.



# Optimal Binary Search Trees

Input: Array of keys

$A[1..n]$ ,

that are sorted

frequencies  $f[1..n]$

Key  $A[i]$  will be sought  
after  $f[i]$  times.

How to minimize total  
search time in a BST  
over  $A$ .

( $A$  is sorted. Not  $f$ )

For a given BST  $T$ :

$v_1, v_2, \dots, v_n$  in order

$v_i$  store  $A[i]$

$\text{Cost}(T, f[1..n]) :=$

$$\sum_{i=1}^n f[i] \cdot \# \text{ancestors of } v_i \text{ in } T$$

(root has 1 ancestor, itself)

$T$  has a root, a left subtree or right subtree...

$r$ : root key <sub>$n$</sub>

$$\begin{aligned} \text{Cost}(T, f) &= \sum_{i=1}^n f[i] + \\ &+ \sum_{i=1}^{r-1} f[i] \cdot \# \text{anc in } \text{left}(T) \\ &+ \sum_{i=r+1}^n f[i] \cdot \# \text{anc. in } \text{right}(T) \end{aligned}$$

$$= \sum_{i=1}^n f[i] + \text{Cost}(\text{left}(T), f[1..r-1])$$

$$+ \text{Cost}(\text{right}(T), f[r+1..n])$$

$$\text{Cost}(T, f[1..0]) = 0$$

Idea: Guess root key +  
recurse on smaller + greater  
keys.

Recursive subsets are contiguous!



$\text{OptCost}(i, k)$ : optimal cost  
of any tree over

$A[i..k]$ .

$\text{OptCost}(i, k) =$

$$\begin{cases} 0 & \text{if } i > k \\ \left( \sum_{j=i}^k f[j] \right) + \min_{i \leq r \leq k} \left\{ \text{OptCost}(i, r-1) + \text{OptCost}(r+1, k) \right\} & \text{o.w.} \end{cases}$$

$\uparrow$  cost of touch root over all searches  
 $\uparrow$  guess for root key