

CSCI 3100

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Dynamic Programming  
(cont) ✓

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# Announcements

- HW due Friday  
(next one posted by Fri)

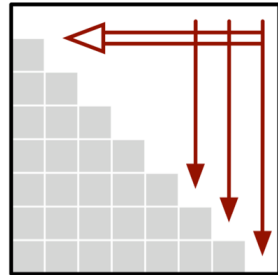
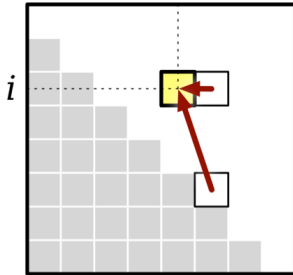
# Last time: LIS

Applications: More theoretical:

- physics
- matrix theory
- representation theory

Idea:

$$LIS(i, j) = \begin{cases} 0 & \text{if } j > n \\ LIS(i, j+1) & \text{if } A[i] \geq A[j] \\ \max\{LIS(i, j+1), 1 + LIS(j, j+1)\} & \text{otherwise} \end{cases}$$



$$LIS(i, j) = \begin{cases} 0 & \text{if } j > n \\ LIS(i, j+1) & \text{if } A[i] \geq A[j] \\ \max\{LIS(i, j+1), 1 + LIS(j, j+1)\} & \text{otherwise} \end{cases}$$

Example:

0, 8, 4, 12, 2, 10

1 2 3 4 5 6

		j ↓					
		1	2	3	4	5	6
i ↓	1		2	2	2	2	1
	2			1	1	1	1
	3				1	1	1
	4					0	0
	5						1
	6						

3

~~j=4~~

~~j=3~~

j=2

Recap: Dynamic programming is just smart recursion.

- Recurse - don't repeat

Often computed values are stored in some table for later lookups

- or -

Can rearrange to fill table from ground up.

# Steps:

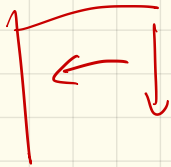
- ① Formulate the recursion
- ② Build solution from base case up.

- identify subproblems

- identify dependences:

ie:  $F(n)$  depended on  $F(n-1)$   
 $\downarrow$   $F(n-2)$

LIS



- choose data structure

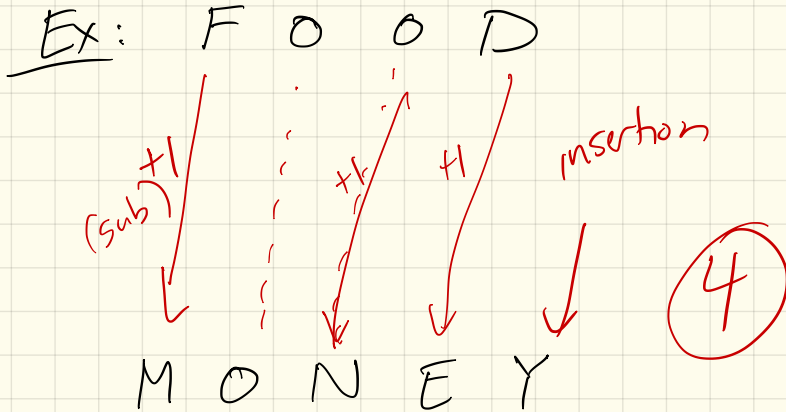
ie: often matrix or  $F(n)$  some temps

- choose evaluation order

- write pseudo code,  
then analyze time/space

# Edit Distance

The minimum number of deletions, insertions, or substitutions of letters to transform between two strings.



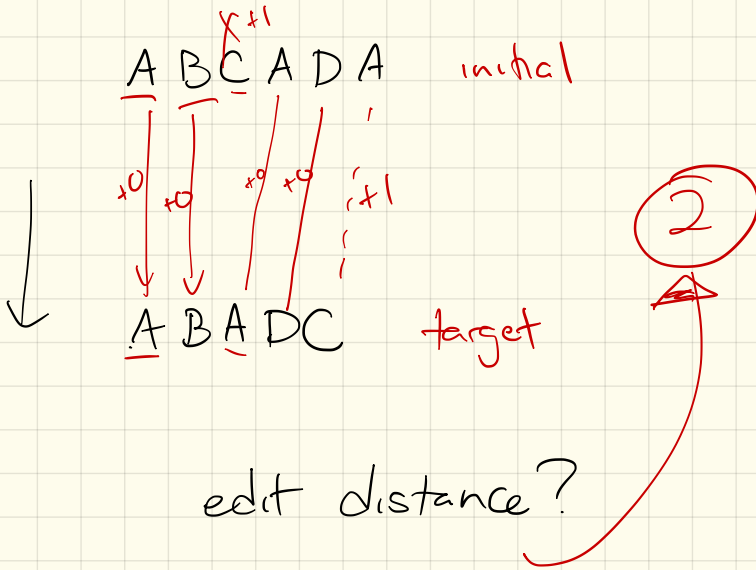
Uses?

spell checkers

sequence alignment

Don't be greedy!

The temptation is to do this  
as you go:

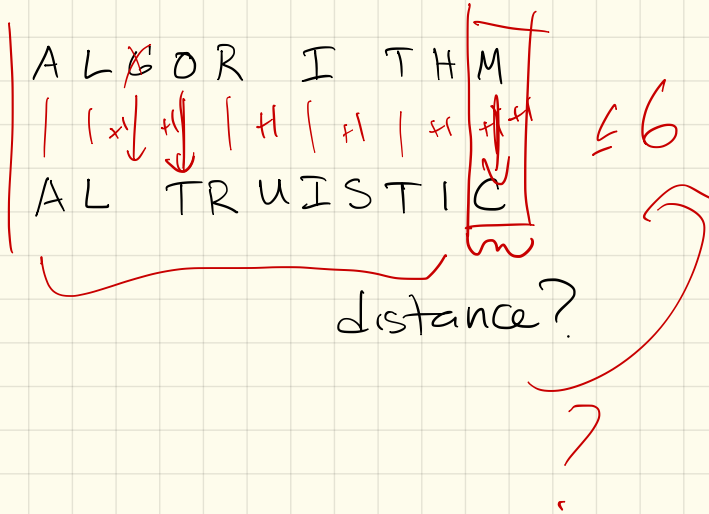


edit distance?



How to solve:

Aligning/matching will help:



# Recursive formulation:

If I align like this, can observe:

If you delete last (aligned) column, the rest will still be optimal for shorter substrings edit distance.

Why?



$c$   $-$   $c$   
 $\downarrow$   $\downarrow$   $+$   
 $c'$   $e$   $-$

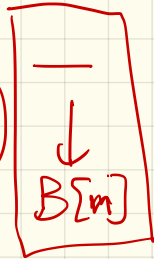
Turning this into a matrix:

Let  $EDIT(A[1..m], B[1..n])$   
be edit distance b/w  $A$  &  $B$ .

When we choose how to align, 3 possibilities:

- insertion:

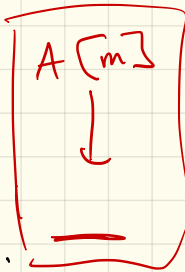
$$EDIT(A[1..m], B[1..n]) + 1$$



C  
+  
X

- deletion:

$$EDIT(A[1..m-1], B[1..n]) + 1$$



- substitution:

$$EDIT(A[1..m-1], B[1..n-1]) + \begin{cases} A[m] \\ \downarrow \\ B[n] \end{cases} \begin{cases} A[m] \\ \downarrow \\ B[n] \end{cases}$$

$(A[m] = B[n])$   
0 or 1

If equal, +0  
if not, +1

Turn this into recursion:

$$\text{Edit}(A[1..m], B[1..n]) = \min \left\{ \begin{array}{l} \text{Edit}(A[1..m-1], B[1..n]) + 1 \\ \text{Edit}(A[1..m], B[1..n-1]) + 1 \\ \text{Edit}(A[1..m-1], B[1..n-1]) + [A[m] \neq B[n]] \end{array} \right\}$$

deletion

insertion

substitution

(0 or 1)

Turning this into a proper recursion:

Let  $EDIT(i, j) :=$  edit distance  
between:

$A[1..i]$

$B[1..j]$

$$Edit(i, j) = \begin{cases} i & \text{if } j = 0 \\ j & \text{if } i = 0 \\ \min \left\{ \begin{array}{l} Edit(i-1, j) + 1, \\ Edit(i, j-1) + 1, \\ Edit(i-1, j-1) + [A[i] \neq B[j]] \end{array} \right\} & \text{otherwise} \end{cases}$$

last  
slide



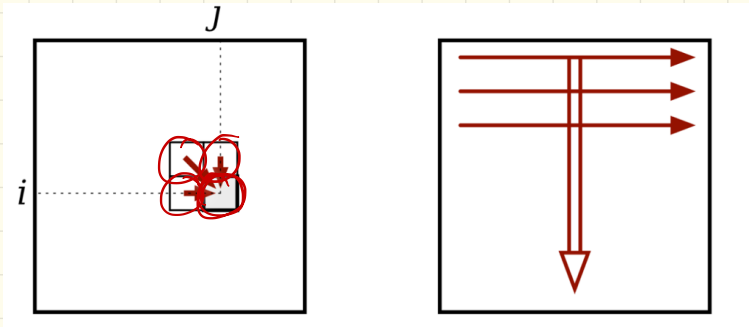
what  
could this be?

Now, don't bother analyzing  
the recursion.

(It's awful!)

Instead, be smart :  
memoize!

Table:



# Algorithm:

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

for  $j \leftarrow 1$  to  $n$

$Edit[0, j] \leftarrow j$

for  $i \leftarrow 1$  to  $m$

$Edit[i, 0] \leftarrow i$

    for  $j \leftarrow 1$  to  $n$

        if  $A[i] = B[j]$

$Edit[i, j] \leftarrow \min \{Edit[i-1, j] + 1, Edit[i, j-1] + 1, Edit[i-1, j-1]\}$

        else

$Edit[i, j] \leftarrow \min \{Edit[i-1, j] + 1, Edit[i, j-1] + 1, Edit[i-1, j-1] + 1\}$

return  $Edit[m, n]$

(analyze  
next time)

Example:

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

The memoization table for  $Edit(\text{ALGORITHM}, \text{ALTRUISTIC})$

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