

"Hw 11" out later today

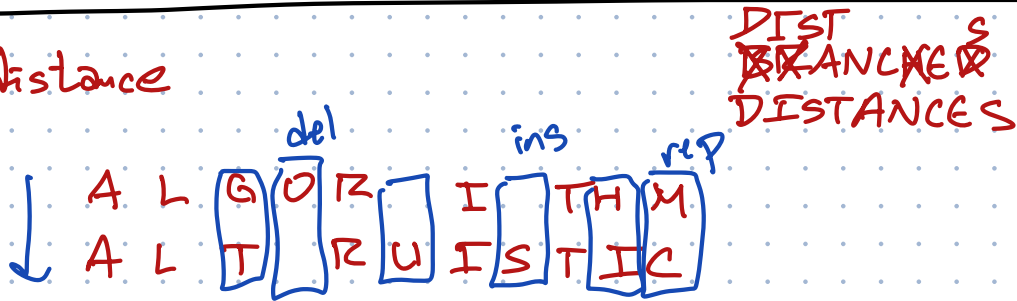
Practice Final next Tue here

Dec 17 7-10 pm in this room

Conflict — Dec 16 ~~Sem~~ — please fill out reg form by Fri

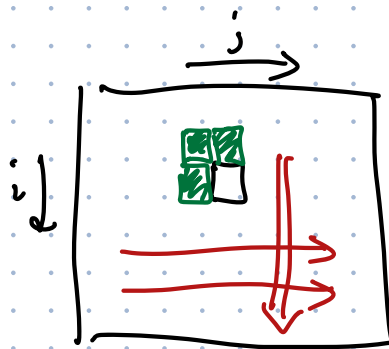
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Edit distance



$Edit(i, j)$  = edit distance between  $A[1..i]$  and  $B[1..j]$

$$Edit(i, j) = \begin{cases} i & \text{if } j = 0 \\ j & \text{if } i = 0 \\ \min \begin{cases} Edit(i, j-1) + 1 & \leftarrow \text{ins} \\ Edit(i-1, j) + 1 & \leftarrow \text{del} \\ Edit(i-1, j-1) + [A[i] \neq B[j]] & \leftarrow \text{rep} \end{cases} & \text{otherwise} \end{cases}$$



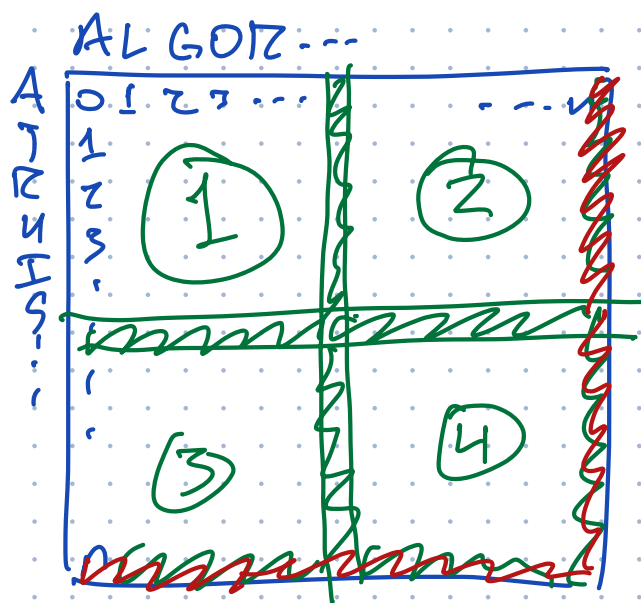
$O(n^2)$  time

Given the table  
we can compute  
the optimal  
edit sequence  
 $O(n^2)$  time  
 $O(n^2)$  space

	A	L	G	O	R	I	T	H	M	
0	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

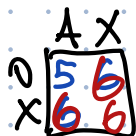
If we only want  
distance, we  
only need to  
maintain one row  
 $O(n^2)$  time  
 $O(n)$  space

Porque no los dos?



Given first row  
first col  
compute last row  
last col

Chowdhury  
Ramachandran  
2006ish



$$T(n) = 4T\left(\frac{n}{2}\right) + O(n) = O(n^2)$$

$$S(n) = S\left(\frac{n}{2}\right) + O(n) = O(n)$$

Edit		A	L	G	O	R	I	T	H
	0	1	2	3	4	5	6	7	8
A	1								
L	2								
T	3								
R	4								
U	5								
I	6								
S	7								
T	8								

Edit		A	L	G	O	R	I	T	H
	0	1	2	3	4	5	6	7	8
A	1								
L	2								
T	3								
R	4	3	2	2	2				
U	5								
I	6								
S	7								
T	8								

Edit		A	L	G	O	R	I	T	H
	0	1	2	3	4	5	6	7	8
A	1								
L	2								
T	3								
R	4	3	2	2	2	2	3	4	5
U	5								
I	6								
S	7								
T	8								

Edit		A	L	G	O	R	I	T	H
	0	1	2	3	4	5	6	7	8
A	1				3				7
L	2				2				6
T	3				2				5
R	4	3	2	2	2	2	3	4	5
U	5				3				
I	6				4				
S	7				5				
T	8	7	6	6	6				

Edit		A	L	G	O	R	I	T	H
	0	1	2	3	4	5	6	7	8
A	1				3				7
L	2				2				6
T	3				2				5
R	4	3	2	2	2	2	3	4	5
U	5				3				5
I	6				4				5
S	7				5				5
T	8	7	6	6	6	6	5	4	5

Edit		A	L	G	O	R	I	T	H
									8
A									7
L									6
T									5
R									5
U									5
I									5
S									5
T	8	7	6	6	6	6	5	4	5

EDITBOUNDARY( $i, j, w, T[0..w], L[0..w]$ ):

if  $w = 1$

$B[0] \leftarrow L[1]; R[0] \leftarrow T[1]$

compute  $B[1]$  using the edit distance recurrence

$R[1] \leftarrow B[1]$

return  $R[0..1], B[0..1]$

else

$T_{11} \leftarrow T[0..w/2]; T_{12} \leftarrow T[w/2..w]$

$L_{11} \leftarrow L[0..w/2]; L_{21} \leftarrow L[w/2..w]$

$T_{21}, L_{12} \leftarrow \text{EDITBOUNDARY}(i, j, w/2, T_{11}, L_{11})$

$T_{22}, R_{12} \leftarrow \text{EDITBOUNDARY}(i, j + w/2, w/2, T_{12}, L_{12})$

$B_{21}, L_{22} \leftarrow \text{EDITBOUNDARY}(i + w/2, j, w/2, T_{21}, L_{21})$

$B_{22}, R_{22} \leftarrow \text{EDITBOUNDARY}(i + w/2, j + w/2, w/2, T_{22}, L_{22})$

return  $B_{21} \cdot B_{22}, R_{12} \cdot R_{22}$  *⟨⟨Concatenation⟩⟩*

Edit		D	I	S	T	A	N	C	E
	0	1	2	3	4	5	6	7	8
B	1								
R	2								
A	3								
N	4								
C	5								
H	6								
E	7								
D	8								

Edit		D	I	S	T	A	N	C	E
	0	1	2	3	4	5	6	7	8
B	1				4				
R	2		①		4			②	
A	3				4				
N	4	4	4	4	4	4	4	5	6
C	5				5				
H	6		③		6				
E	7				7				
D	8				8				

Edit		D	I	S	T	A	N	C	E
	0	1	2	3	4	5	6	7	8
B	1				4				
R	2				4				
A	3				4				
N	4	4	4	4	4	4		4	
C	5							4	
H	6							5	
E	7							5	6
D	8							6	

Edit		D	I	S	T	A	N	C	E
	0	1	2	3	4	5	6	7	8
B	1				4				
R	2				4				
A	3				4				
N	4				4				
C								4	
H								5	
E								5	6
D								6	

Edit		D	I	S	T	A	N	C	E
	0	1	2	3	4				
B	1								
R	2								
A	3								
N	4								
C								4	
H								5	
E								5	6
D								6	

Edit		D	I	S	T	A	N	C	E
	0								
B									
R		1							
A			2	3	4				
N								4	
C								4	
H								4	
E								5	6
D								6	

$$T(n) = O(n^2) + 3T\left(\frac{n}{2}\right) = O(n^2)$$

①②③

$$S(n) = O(n) + S\left(\frac{n}{2}\right) = O(n)$$

EDITSEQUENCE( $i, j, w, T[0..w], L[0..w], ti, tj$ ):

if  $w = 1$

⟨⟨Base case: Brute force⟩⟩

compute operation  $Z$  and indices  $si, sj$  using the edit distance recurrence

return  $Z, si, sj$

else if ( $ti \leq i$  or  $ti \geq i + w$  or  $tj \leq j$  or  $tj \geq j + w$  or ( $ti < i + w$  and  $tj < j + w$ ))

⟨⟨Trivial case: target indices are not on the outer block boundary⟩⟩

return  $\epsilon, ti, tj$

else

⟨⟨Forward phase: Set up inputs for recursive subproblems⟩⟩

$T_{11} \leftarrow T[0..w/2]; T_{12} \leftarrow T[w/2..w];$

$L_{11} \leftarrow L[0..w/2]; L_{21} \leftarrow L[w/2..w]$

$T_{21}, L_{12} \leftarrow \text{EDITBOUNDARY}(i, j, w/2, T_{11}, L_{11})$

$T_{22}, R_{12} \leftarrow \text{EDITBOUNDARY}(i, j + w/2, w/2, T_{12}, L_{12})$

$B_{21}, L_{22} \leftarrow \text{EDITBOUNDARY}(i + w/2, j, w/2, T_{21}, L_{21})$

⟨⟨Backward phase: Recursively backtrack along the optimal edit path.⟩⟩

⟨⟨At most three of these recursive calls actually do anything.⟩⟩

⟨⟨Each nontrivial recursive call updates  $ti$  and  $tj$ .⟩⟩

$Z_{22}, ti, tj \leftarrow \text{EDITSEQUENCE}(i + w/2, j + w/2, w/2, T_{22}, L_{22}, ti, tj)$

$Z_{21}, ti, tj \leftarrow \text{EDITSEQUENCE}(i + w/2, j, w/2, T_{21}, L_{21}, ti, tj)$

$Z_{12}, ti, tj \leftarrow \text{EDITSEQUENCE}(i, j + w/2, w/2, T_{12}, L_{12}, ti, tj)$

$Z_{11}, ti, tj \leftarrow \text{EDITSEQUENCE}(i, j, w/2, T_{11}, L_{11}, ti, tj)$

return  $Z_{11} \cdot Z_{12} \cdot Z_{21} \cdot Z_{22}, ti, tj$

ALPHABET  
R  
4  
S  
T

3 4 5 5 4

ALPHABET  
R  
4  
S  
T

3 4 5 5 4

5  
6  
7

← w →

# characters  
in alphabet =  $s = O(1)$

$$w = \frac{1}{2} \log_s n$$

Specify subproblem:  $O(\sqrt{n})$

Two strings:  $2 \cdot s^w \rightarrow O(w \log s) = O(w)$  bits

X one number:  $O(\log n)$  bits = 1 word

differences:  $O(w)$  bits  $\rightarrow O(\sqrt{n})$  possibilities

# diff subprobs  
=  $O(n)$   
=  $O(\sqrt{n})$



Precompute ALL  $O(\sqrt{n})$  block outputs in  $O(\sqrt{n} \log^2 n)$  time  
 $\ll o(n)$

Short circuit CK algo at  $w \times w$

$$\Rightarrow \text{Time} = O(n^2 / \log^2 n)$$

$$\text{Space} = O(n / \log n) + \text{output}$$