



## Lecture 10

# Dynamic Programming II: Bellman-Ford (cont), Interval Scheduling, Longest Common Subsequence

CS 161 Design and Analysis of Algorithms

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# Case study III: Bellman-Ford

**In words:**  $d[s] = 0, d[u] = +\infty$  for  $u \neq s$ .

For  $n - 1$  times, relax all the edges  $(u, v)$ .

**Relaxation of  $(u, v)$**

**If  $d[v] > d[u] + w(u, v)$  then**  
 $d[v] \leftarrow d[u] + w(u, v)$

**Running time  $\Theta(|V| \cdot |E|)$**

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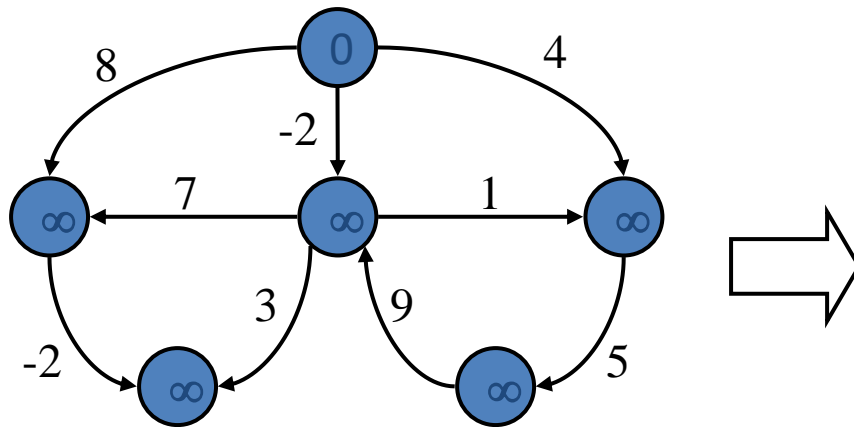
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**Running time  $\Theta(|V| \cdot |E|)$**

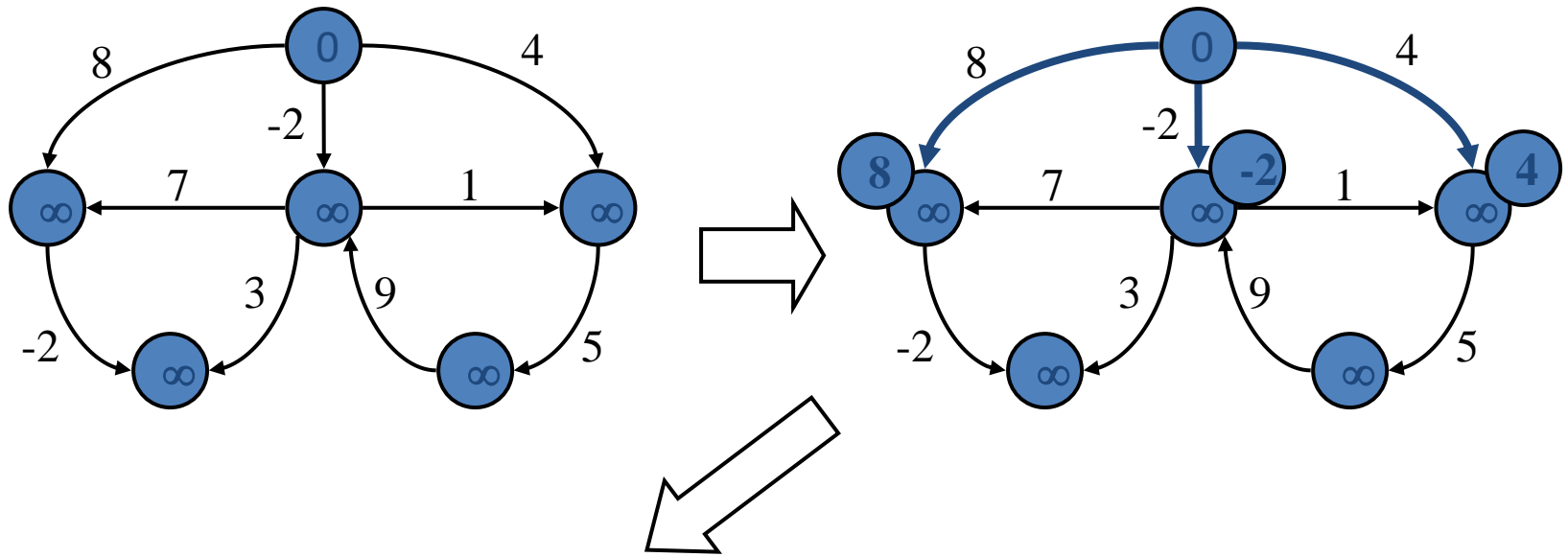
**Property:** Suppose we relax all edges **one more time**. If  $d[]$  **decreases** for a vertex then there is a **negative cycle**. If  $d[]$  **remains the same**, no **negative cycle**.

# Case study III: Bellman-Ford

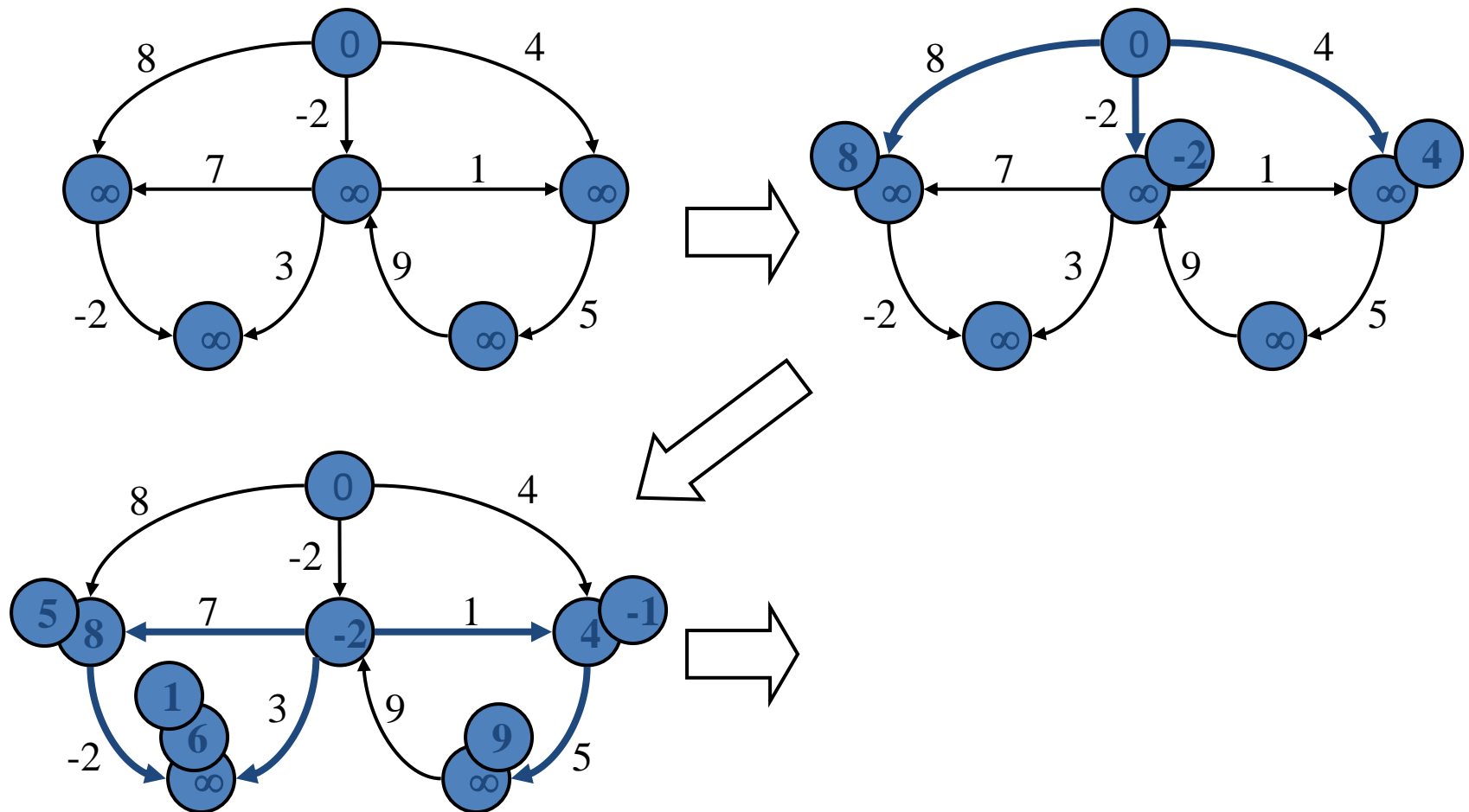
Find the shortest weight path from node 0.



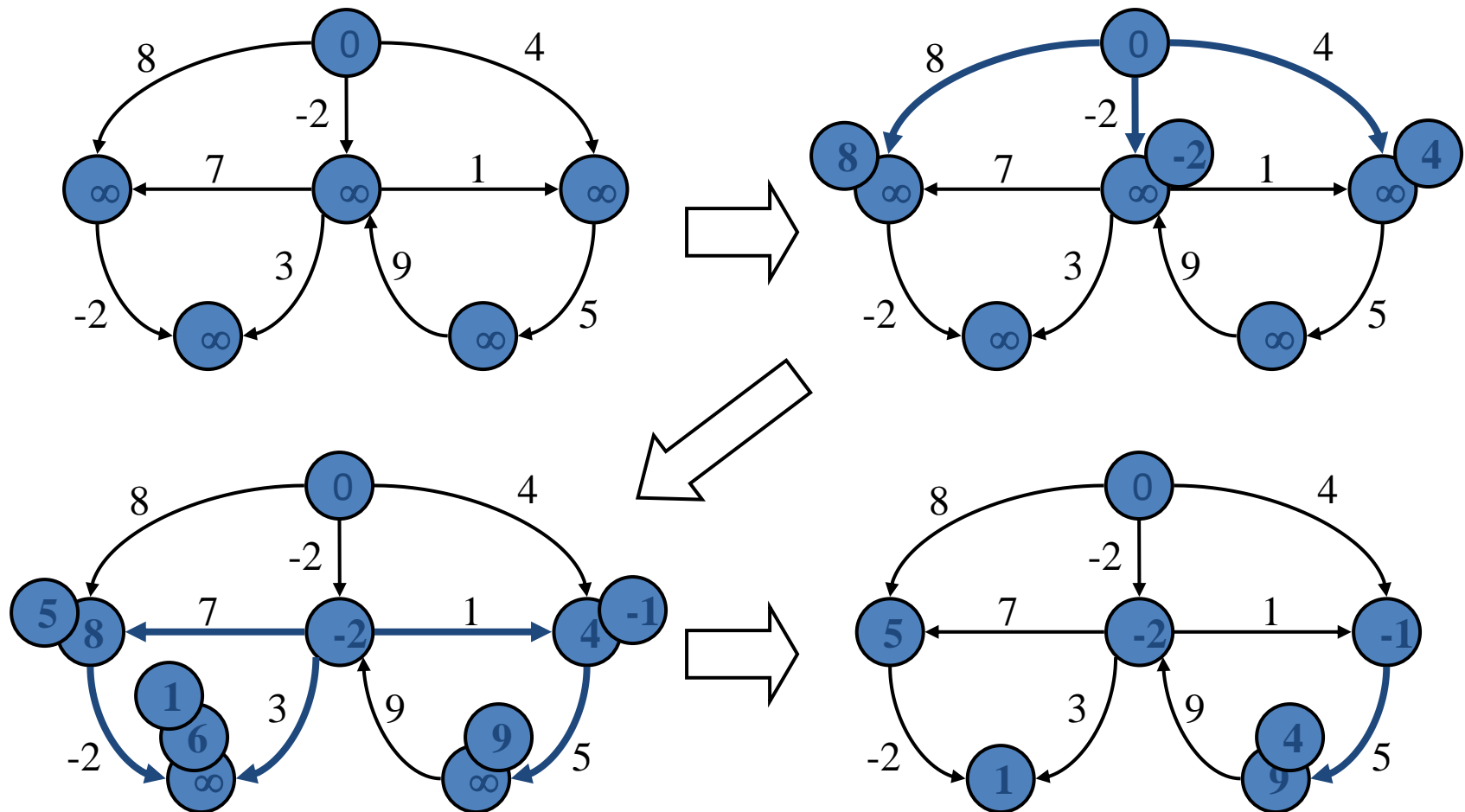
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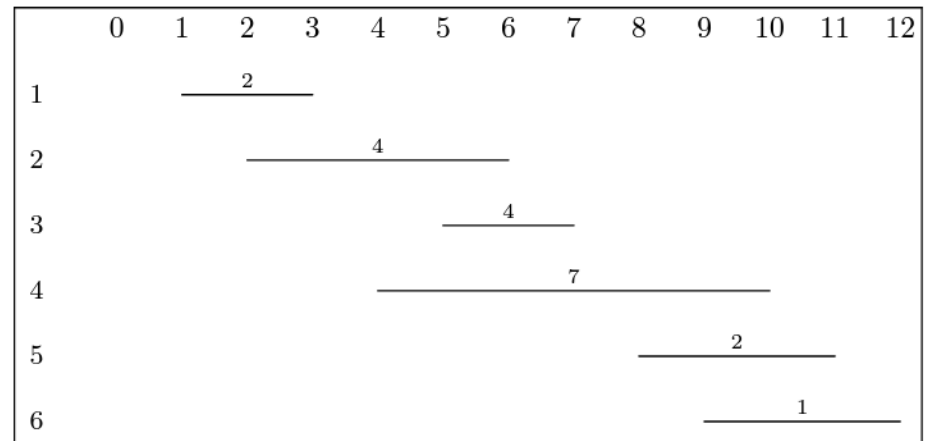


# Case study IV: Interval Scheduling

**Problem:** You are given a collection of  $n$  intervals represented by start time, finish time, and value:  $(s_j, f_j, v_j)$ , sorted w.r.t  $f_j$ . Find a non-overlapping set of intervals with maximum total value.

**Example:**

$j$	$s(j)$	$f(j)$	$v(j)$
1	1	3	2
2	2	6	4
3	5	7	4
4	4	10	7
5	8	11	2
6	9	12	1



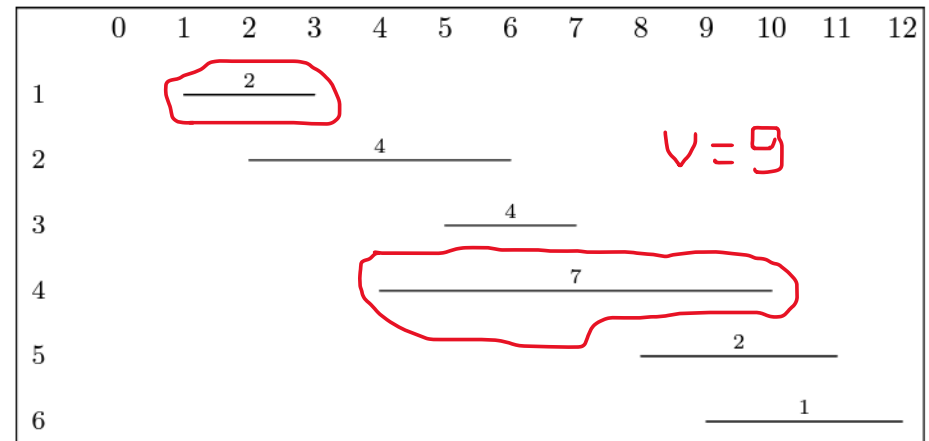


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# Case study IV: Interval Scheduling

**Step 1:** Define the problem and subproblems.

**Answer:** Let  $DP[j]$  be the maximum value that can be obtained from a set of non-overlapping intervals with indices in the range  $\{1, \dots, j\}$

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**Step 2:** Define the goal/output given Step 1.

It is  $DP[n]$ .

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**Step 2:** Define the goal/output given Step 1.

It is  $DP[n]$ .

**Step 3:** Define the base cases

It is  $DP[0] = 0$ .

**Step 4:** Define the recurrence

# Case study IV: Interval Scheduling

## Step 4: Define the recurrence

Interval  $j$  belongs to the optimal solution or **not**.

$$DP[j] = \max(DP[\$] + v_j, DP[j - 1])$$

What is  $\$$  ?

# Case study IV: Interval Scheduling

## Step 4: Define the recurrence

Interval  $j$  belongs to the optimal solution or **not**.

$$DP[j] = \max(DP[\$] + v_j, DP[j - 1])$$

$\$$  should be the interval with highest index in  $\{1, \dots, j - 1\}$  that does not intersect with  $j$  (since  $j$  is chosen).

Let  $p[j]$  be the highest index in  $\{1, \dots, j - 1\}$  that does not intersect with  $j$ . Then the recurrence becomes

$$DP[j] = \max(DP[p[j]] + v_j, DP[j - 1])$$

# Case study IV: Interval Scheduling

## Pseudocode:

Array  $DP[]$

$DP[0] \leftarrow 0$

Initialization

**For**  $k = 1$  to  $n$  **do**

$DP[k] \leftarrow \max(DP[k - 1], DP[p[k]] + v[k])$

Bottom up filling DP

**return**  $DP[n]$

Goal

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Goal

**Question:** How can we compute  $p[j]$  for  $1 \leq j \leq n$  in  $\Theta(n \log n)$  time?



# Case study IV: Interval Scheduling

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**Answer:**

- **Sort** first the intervals in increasing order of finishing times.

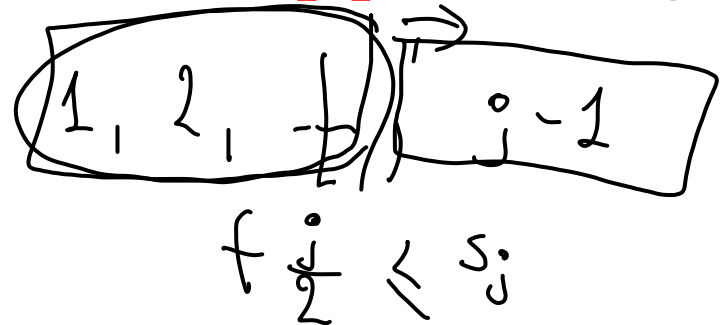
# Case study IV: Interval Scheduling

**Question:** How can we compute  $p[j]$  for  $1 \leq j \leq n$  in  $\Theta(n \log n)$  time?

**Answer:**

- Sort first the intervals in increasing order of finishing times.
- For every  $j$ , do **binary search** to find the interval before  $j$  with finishing time at most  $s_j$

$$\log(j)$$



$$\sum_{j=1}^n \log(j) = \log(n!) \in \Theta(n \log n)$$

# Case study V: Longest Common Subsequence

**Problem:** You are given two **strings**  $x = X_1 \dots X_n$  and  $y = Y_1 \dots Y_m$  of sizes  $n, m$  and you are asked to find the size of a longest common substring  $z$  of  $x$  and  $y$ .

**Example:**

$x =$  H I E R O G L Y P H O L O G Y  
 $y =$  M I C H E L A N G E L O

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$y =$  M I C H E L A N G E L O

$z =$  H E G L O

# Case study V: LCS

**Step 1:** Define the problem and subproblems.

**Answer:** Let  $DP[i, j]$  be the **longest common substring** that can be obtained from substrings  $X_1X_2 \dots X_i$  and  $Y_1Y_2 \dots Y_j$ .

# Case study V: LCS

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**Step 2:** Define the goal/output given Step 1.  
It is  $DP[n, m]$ .

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It is  $DP[n, m]$ .

**Step 3:** Define the base cases. “One of two strings is empty”.  $DP[0, j] = 0$  for all  $j$ ,  $DP[i, 0] = 0$  for all  $i$ .

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**Step 4:** Define the recurrence



# Case study V: LCS

**Step 4:** Define the recurrence

**Case 1:**  $x_i = X_1 X_2 \dots X_{i-1} \overset{''}{A}$   
 $y_j = Y_1 Y_2 \dots Y_{j-1} \overset{''}{A}$

**Question:** What is the LCS of  $x_i, y_j$ ?

# Case study V: LCS

**Step 4:** Define the recurrence

**Case 1:**  $x_i = X_1 X_2 \dots X_{i-1} A$   
 $y_j = Y_1 Y_2 \dots Y_{j-1} A$

**Question:** What is the LCS of  $x_i, y_j$ ?

**Answer:** **1** + the LCS of  $x_{i-1}, y_{j-1}$

# Case study V: LCS

**Step 4:** Define the recurrence

**Case 2:**  $x_i = X_1 X_2 \dots X_{i-1} A$   
 $y_j = Y_1 Y_2 \dots Y_{j-1} B$

$LCS(x_{i-1}, y_{j-1})$

**Question:** What is the LCS of  $x_i, y_j$ ?

# Case study V: LCS

**Step 4:** Define the recurrence

**Case 2:**  $x_i = X_1 X_2 \dots X_{i-1} A$   
 $y_j = Y_1 Y_2 \dots Y_{j-1} B$

**Question:** What is the LCS of  $x_i, y_j$ ?

**Answer:** the maximum of the  
LCS of  $x_{i-1}, y_j$  and LCS of  $x_i, y_{j-1}$

$$\begin{aligned} &LCS(x_i, y_j) \\ &\geq LCS(x_{i-1}, y_j) \\ &LCS(x_i, y_j) \\ &\geq LCS(x_i, y_{j-1}) \\ &LCS(x_i, y_j) \geq LCS(x_{i-1}, y_{j-1}) \end{aligned}$$

# Case study V: LCS

Step 4: Define the recurrence

$$DP[i, j] = \begin{cases} \text{(case 1)} \\ \text{if } X_i == Y_j \text{ then } DP[i - 1, j - 1] + 1 \\ \text{if } X_i \neq Y_j \text{ then } \max(DP[i - 1, j], DP[i, j - 1]) \\ \text{(case 2)} \end{cases}$$

# Case study V: LCS

## Pseudocode:

Array  $DP[][]$ ,  $X[]$ ,  $Y[]$ ,  $S[]$  =  $\ell, u, d$

**For**  $i = 1$  to  $n$  **do**

$DP[i, 0] \leftarrow 0$

**For**  $j = 1$  to  $m$  **do**

$DP[0, j] \leftarrow 0$

**For**  $i = 1$  to  $n$  **do**

**For**  $j = 1$  to  $m$  **do**

**If**  $X[i] == Y[j]$  **then**

$DP[i, j] \leftarrow DP[i - 1, j - 1] + 1$ ,  $S[i][j] = \text{diagonal}$

**else**  $DP[i, j] \leftarrow \max(DP[i - 1, j], DP[i, j - 1])$

**return**  $DP[n, m]$

$S[i][j] = u$

$S[i][j] = \ell$

Goal

$S[n, m]$   $S[n, m]$   
 $S[n-1, m]$   
 $S[n-1, m-1]$

Initialization

Bottom up filling DP

# Case study V: LCS

**Example:**  $x$  is the string "ABCB~~D~~AB" and  $y$  is the string "BDCABA".

# Case study V: LCS

**Example:**  $x$  is the string "ABCB DAB" and  $y$  is the string "BDCABA".

	j	0	1	2	3	4	5	6
i		$y_j$	B	D	C	A	B	A
0	$x_i$	0	0	0	0	0	0	0
1	A	0						
2	B	0						
3	C	0						
4	B	0						
5	D	0						
6	A	0						
7	B	0						



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2	B	0						
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	j	0	1	2	3	4	5	6
i		$y_j$	B	D	C	A	B	A
0	$x_i$	0	0	0	0	0	0	0
1	A	0	0	0	0	1	1	1+0=1
2	B	0						
3	C	0						
4	B	0						
5	D	0						
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1	A	0	0	0	0	1	1	
2	B	0						
3	C	0						
4	B	0						
5	D	0						
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1	A	0	0	0	0	1	1	1
2	B	0	1	0				
3	C	0						
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2	B	0	1	1	1	1	2	
3	C	0						
4	B	0						
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1	A	0	0	0	0	1	1	1
2	B	0	1	1	1	1	2	2
3	C	0	1	1	2	2	2	2
4	B	0	1	1	2	2	3	3
5	D	0	1	2	2	2	3	3
6	A	0	1	2	2	3	3	4
7	B	0	1	2	2	3	4	4

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i		$y_j$	B	D	C	A	B	A
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1	A	0	0	0	0	1	1	1
2	B	0	1	1	1	1	2	2
3	C	0	1	1	2	2	2	2
4	B	0	1	1	2	2	3	3
5	D	0	1	2	2	2	3	3
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1	A	0	0	0	0	1	1	1
2	B	0	1	1	1	1	2	2
3	C	0	1	1	2	2	2	2
4	B	0	1	1	2	2	3	3
5	D	0	1	2	2	2	3	3
6	A	0	1	2	2	3	3	4
7	B	0	1	2	2	3	4	4

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2	B	0	1	1	1	1	2	2
3	C	0	1	1	2	2	2	2
4	B	0	1	1	2	2	3	3
5	D	0	1	2	2	2	3	3
6	A	0	1	2	2	3	3	4
7	B	0	1	2	2	3	4	4

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2	B	0	1	1	1	1	2	2
3	C	0	1	1	2	2	2	2
4	B	0	1	1	2	2	3	3
5	D	0	1	2	2	2	3	3
6	A	0	1	2	2	3	3	4
7	B	0	1	2	2	3	4	4