



Content for Today

- Introduction
- Fibonacci series ✓
- Climb stairs ✓
- Max sum without adjacent elements ✓
- Unique paths ✓
- 0-1 Knapsack
- Unbounded knapsack
- Rod cutting problem
- longest common subsequence ✓
- Edit distance ✓

DP / Dynamic Programming

↳ optimize recursion

$A[] =$	<table border="1"><tr><td>1</td><td>2</td><td>3</td></tr><tr><td>0</td><td>1</td><td>2</td></tr><tr><td>1</td><td>3</td><td>6</td></tr></table>	1	2	3	0	1	2	1	3	6
1	2	3								
0	1	2								
1	3	6								
$Pf[] =$										

$Pf[i]$ = sum of all elements from 0 to i

Fibonacci series

0 1 1 2 3 5 8 13 21 ...

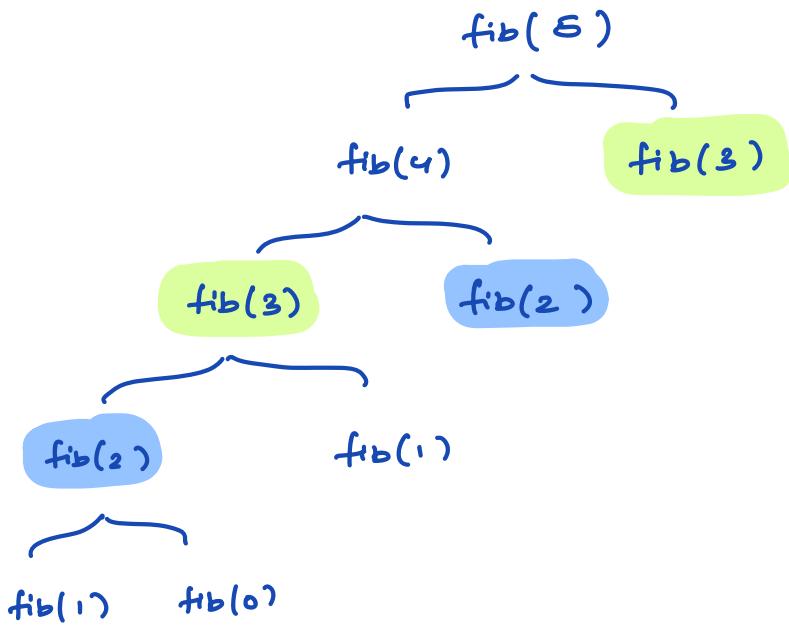
$$fib(n) = fib(n-1) + fib(n-2)$$

$$fib(0) = 0 \quad fib(1) = 1$$

```
int fib(n)
{
    if (n ≤ 1) return n;
    return fib(n-1) + fib(n-2);
}
```

$$TC: O(2^n)$$

$SC: O(n)$ → spare by recursive stack



- # Overlapping sub problems → Repeating subproblems
- II Optimal substructure → Solving problems by reducing problem in smaller subproblems

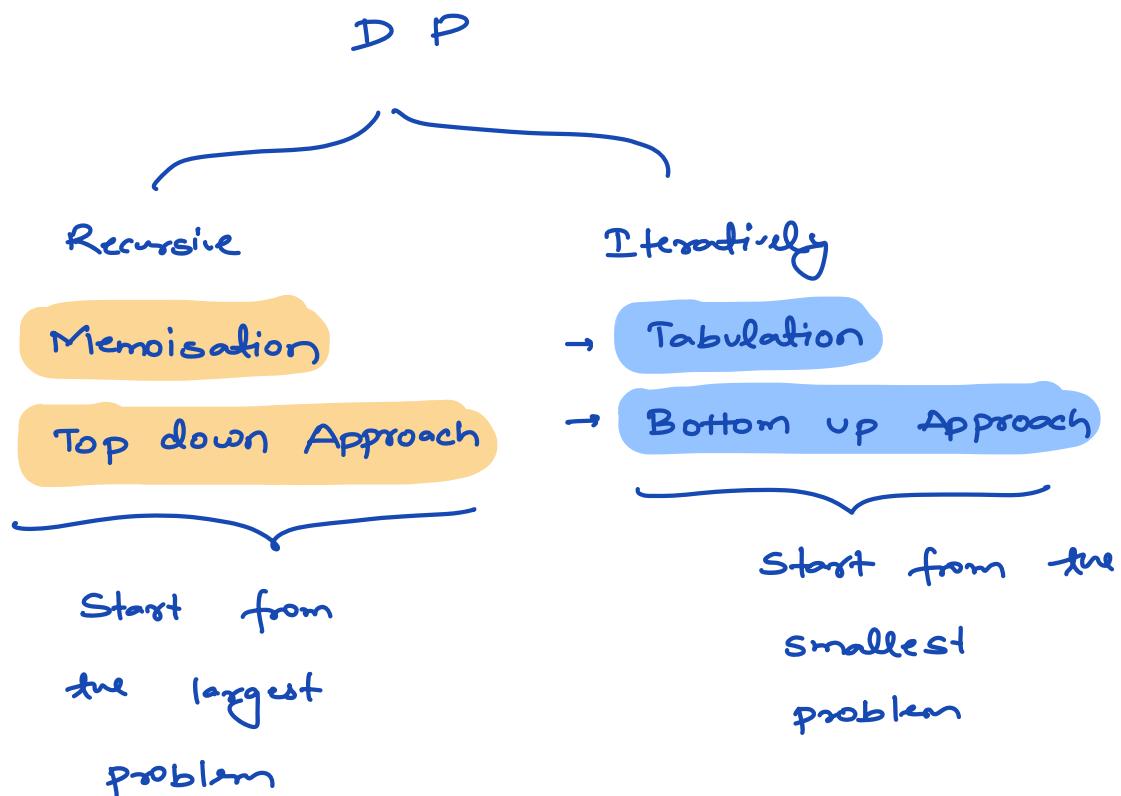
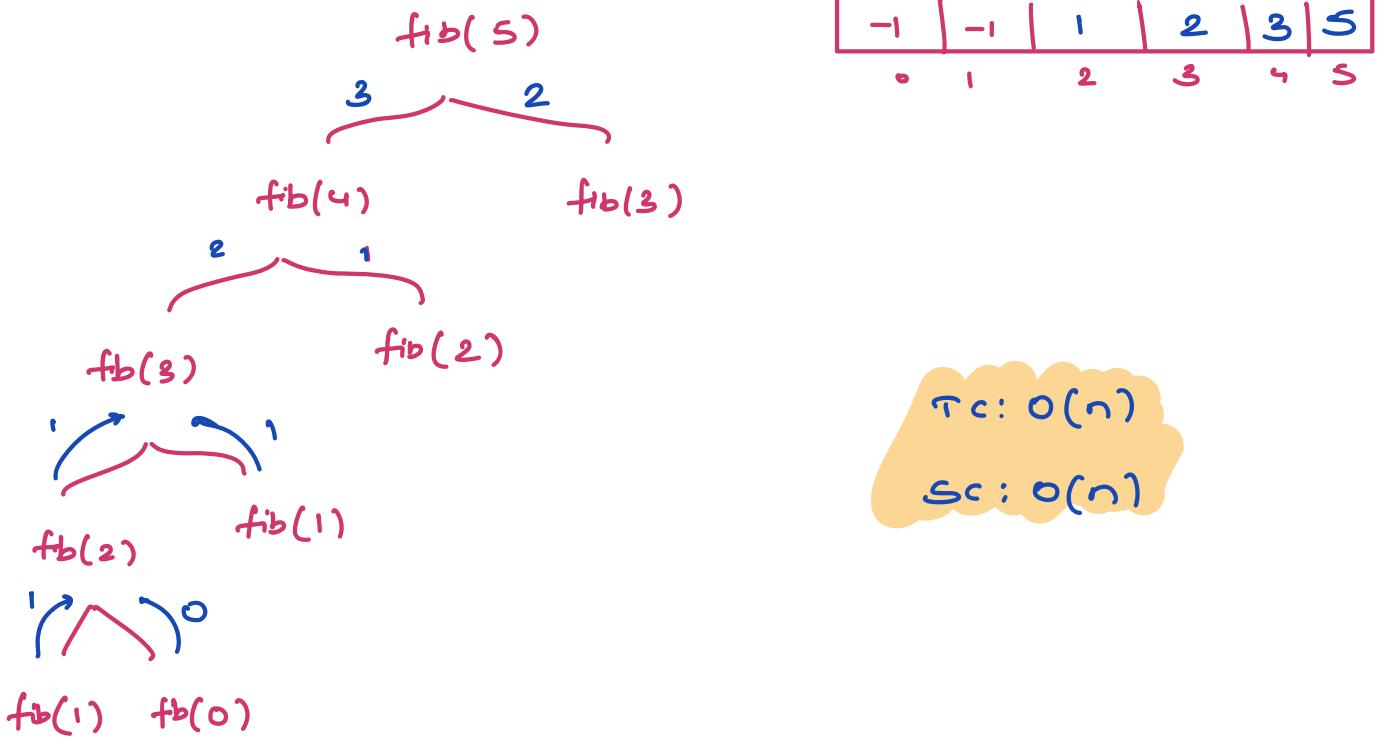
Solution → Store the answer for already solved problems.

```

int [] dp = new int [n+1] ] ↓
int fib(n)
|   if (n ≤ 1) return n;
|   if (dp[n] != -1) return dp[n];
|   return dp[n] = fib(n-1) + fib(n-2)
  
```

initialise the
dp = -1

3



dp size = $n+1$

$$\text{fib}(0) = 0$$

$$\text{fib}(1) = 1$$

0	1	1	2	3	5
0	1	2	3	4	5

$$\text{dp}[0] = 0$$

$$\text{dp}[1] = 1$$

for ($i=2; i \leq n; i++$) {

$$\text{dp}[i] = \text{dp}[i-1] + \text{dp}[i-2]$$

}

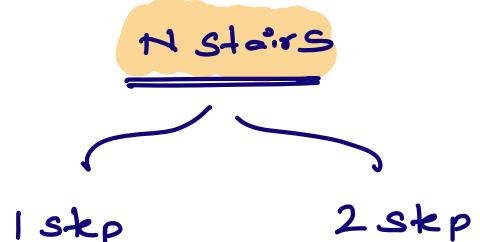
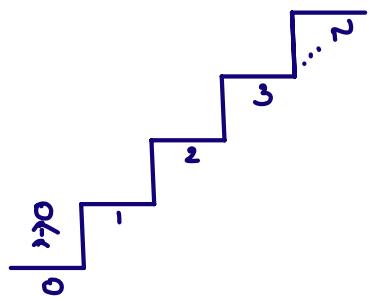
TC : $O(n)$

Sc : $O(n)$

(No recursive
stack space)

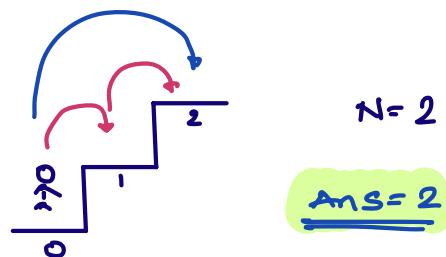
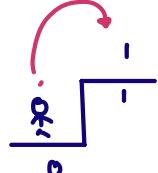
return $\text{dp}[n]$

* Stairs → No. of ways to reach N^+ stair



$N=1$

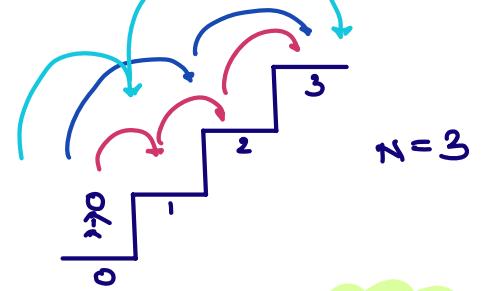
Ans = 1



$N=0$

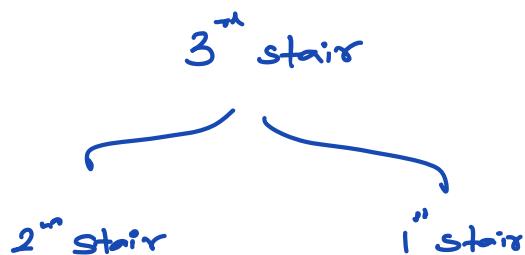
Ans = 1

do nothing



Ans = 3

(1,1,1)
(1,2)
(2,1)

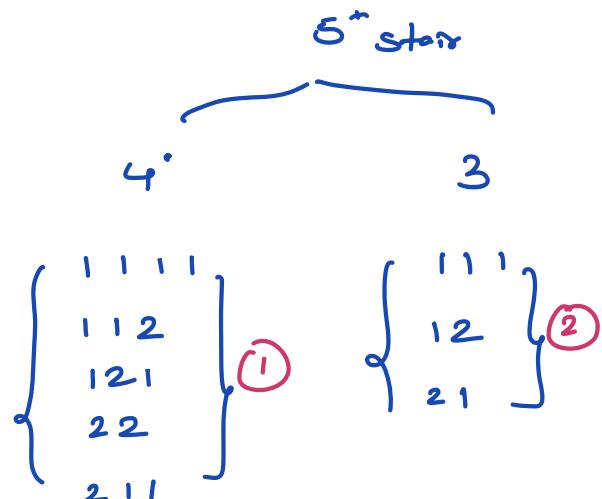
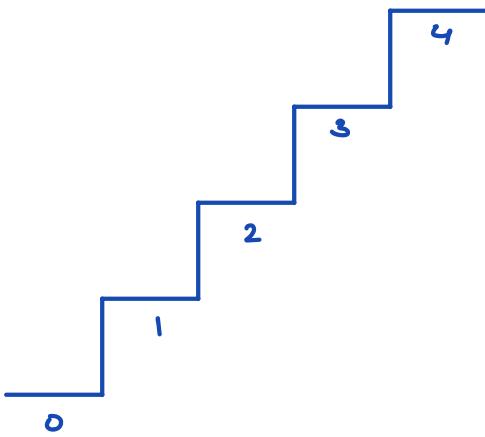


$$\left\{ \begin{matrix} 1 & 1 \\ 1 & 2 \end{matrix} \right\} \textcircled{1} \quad \left\{ \begin{matrix} 1 \\ 1 \end{matrix} \right\} \textcircled{2}$$

$$\text{stairs}(n) = \text{stairs}(n-1) + \text{stairs}(n-2)$$

$dp[3] = \text{no. of ways to reach } 3^{\text{rd}} \text{ step from } 0^{\text{th}} \text{ step}$

1	1	2	3	5	8
0	1	2	3	4	5



$$dp[0] = 1$$

$$dp[i] = dp[i-1] + dp[i-2]$$

Q3

Given $ar[N]$ calculate max subsequence sum

Note 1 \rightarrow In a subseq 2 adj ele can't be picked

Note 2 \rightarrow Empty subseq is also valid.

$$ar[3] = \{9 \ 14 \ 3\} = \{14\} = 14$$

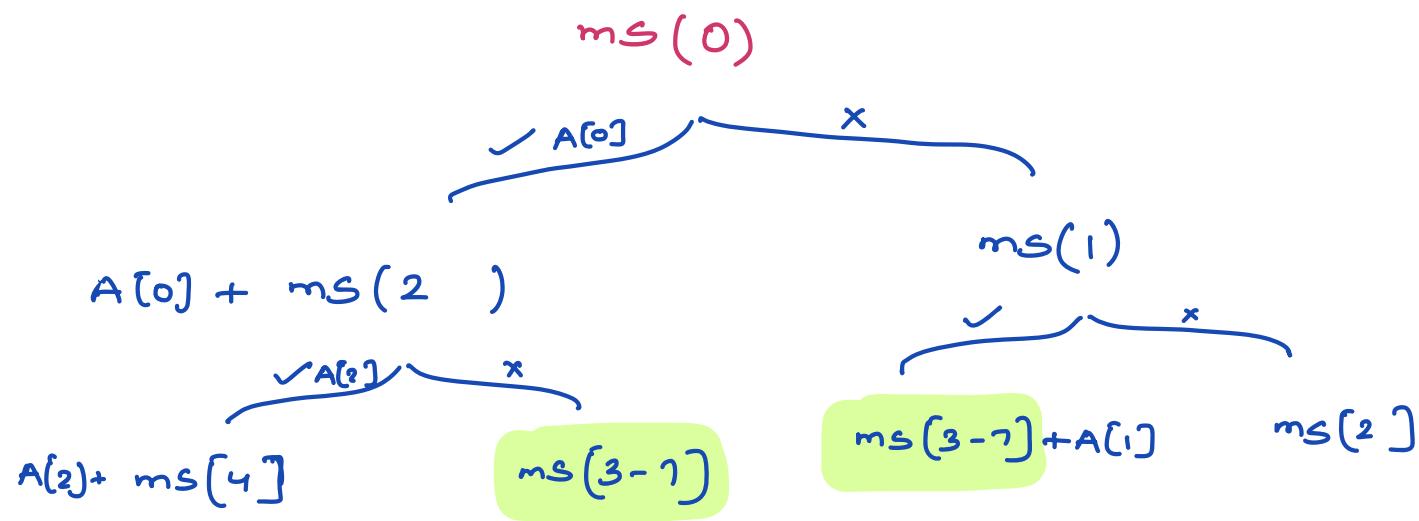
$$ar[4] = \{9 \ 4 \ 13 \ 24\} - \{9, 24\} = 33$$

$$ar[3] = \{13 \ 14 \ 2\} = \{13, 2\} = 15$$

$$ar[4] = \{-4 \ -3 \ -2 \ -3\} = \underline{0} \Rightarrow \text{Empty subsequence}$$

$$A[] = \{2 \ -1 \ -4 \ 5 \ 5 \ -1 \ 4 \ 2\}$$

$\begin{matrix} 0 & 1 & 2 & 3 & 4 & 5 & 6 & 7 \end{matrix}$



```
int dp[n] = Int_Min
```

```
int maxsubsum ( int [] A, int i )
{
    if ( i >= n ) return 0;
    if ( dp[i] != -1 ) return dp[i];
    int pick = maxsubsum ( A, i+2 ) + A[i];
    int npick = maxsubsum ( A, i+1 );
    return dp[i] = max ( pick, npick );
}
```

```
main() {
```

```
SOP ( max ( maxsubsum ( A, 0 ), 0 ) );
```

* Bottom up Approach (DP needs to be filled from last)

$dp[i] = \max$ subsequence sum $[i \dots n-1]$ such that
there is no adj ele

```
int dp[n];
for (i=n-1; i>=0; i--) {
    if (i+1 < n) dp[i] = dp[i+1] + 0
    if (i+2 < n) dp[i] = max(dp[i], dp[i+2]);
}
return dp[0];
```

$$TC = O(n)$$

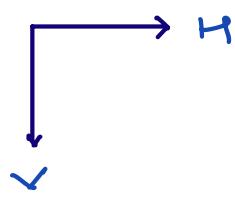
$$SC : O(1)$$

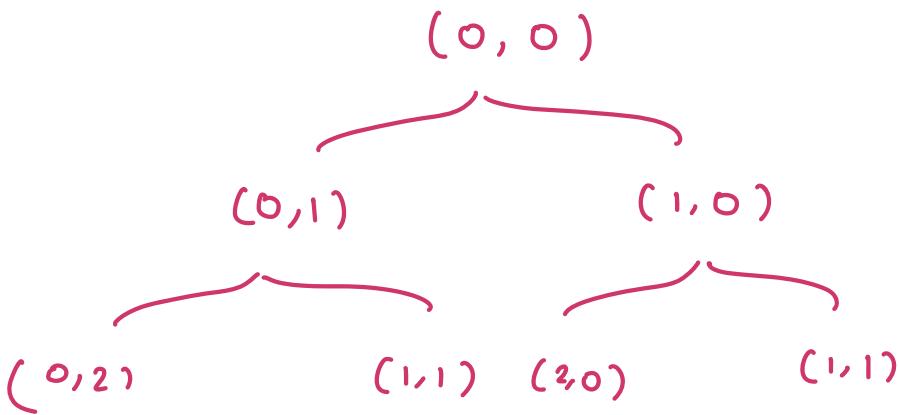
Q Number of ways to go from $(0,0) \rightarrow BR$ cell in mat $[N][M]$

Note:- From cell we can go to right or down

Eg:

	0	1	2
0			
1			
2			





0 0
 \uparrow \uparrow
`ways(int i, int j)`
 $|$
`if (i == n-1 && j == n-1) return 1;`
`if (i >= n || j >= n) return 0;`
`if (dp[i][j] != -1) return dp[i][j]`
`return dp[i][j] = ways(i, j+1) + ways(i+1, j)`

// iterative approach

```

for ( i = n-1; i >= 0; i-- )
    for ( j = n-1; j >= 0; j-- ) {
        if ( i == n-1 && j == n-1 ) dp[i][j] = 1
        else {
            dp[i][j] = dp[i+1][j] + dp[i][j+1]
        }
    }
return dp[0][0];

```

12:41 → 12:47 p4

0	1	2	
0	TL 6	HVV VHV VVH	VV
1	HHV HVM VHH	• HV VH	V
2	HH	H	1

O/I knapsack

Given N items each with a weight & value, find max value which can be obtained by picking items such that total weight of all items $\leq K$

Note 1 :- Every item can be picked at max 1 time

Note 2 :- We cannot take a part of item

Eg:-

N = 4 items

K = 50

Items: 0 1 2 3

Value[] : 100 60 120 150

Weight[] : 20 10 30 40

$v/w = 5 \ 6 \ 4 \ 3.75$

Greedy → Pick item with max v/w ratio 

$$\sum v = 60 + 100 = \underline{160}$$

$$\sum w = 10 + 20$$

Greedy - Pick item with max value

$$\sum v = 150 + 60 = 210$$

$$\sum w = 40 + 10 = 50$$

* Correct ans

$$\Sigma v = 100 + 120 = \underline{\underline{220}}$$

$$\Sigma w = 20 + 30 = 50$$

Idea 2 → Generate all combinations.

Every ele has two choices



& return the ans which is providing the max value.

$$cap = 15$$

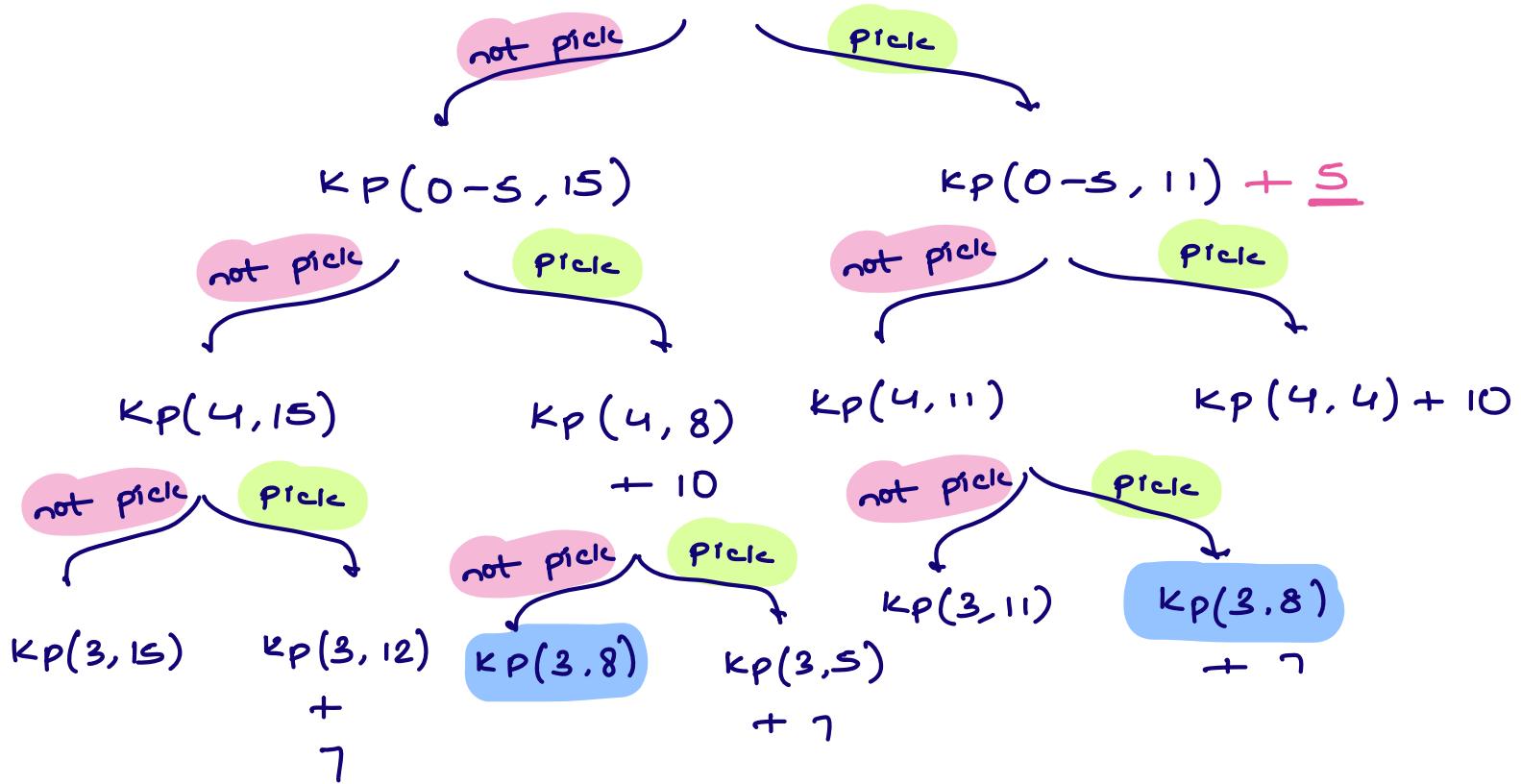
$$N = 7$$

$$wt[] = \{ 4, 1, 5, 4, 3, 7, 4 \}$$

$$wt[] = \{ 0, 1, 2, 3, 4, 5, 6 \}$$

$$val[] = \{ 3, 2, 8, 3, 7, 10, 5 \}$$

KP(0-6, 15)



Code →



```
int knapsack ( int i, int j, int []w, int []val )  
{  
    if ( i < 0 || j < 0 ) return -∞;  
    int not pick = knapsack ( i-1, j, w, val );  
    int pick = 0;  
  
    if ( j ≥ w[i] )  
    {  
        pick = knapsack ( i-1, j-w[i], w, val ) + val[i];  
    }  
    return max ( not pick, pick );  
}
```

Top down

int [][] dp = new int[n][k+1]; $\xrightarrow{-1}$

int knapsack (i , j , wt , val)

if (i < 0 || j ≤ 0) return 0;

if (dp[i][j] != -1) return dp[i][j];

int val = knapsack (i-1, j , wt , val)

if (j ≥ wt)

val = max (val , knapsack(i-1, j-wt[i] , wt , val) + val[i])

return dp[i][j] = val ;

3

int [] wt = {3 6 5 2 4} cap=7
0 1 2 3 4

int [] val = {12 20 15 6 10}

int dp[n+1][k+1]

* Bottom Up Approach

$dp[i][j] = \text{max sum we can generate using } i \text{ elements & bag capacity } = j$

val	wt	ele	cap \rightarrow							
			0	1	2	3	4	5	6	7
0			0	0	0	0	0	0	0	0
12	3		0	0	0	12	12	12	12	12
20	6		0	0	0	12	12	12	20	20
15	5		0	0	0	12	12	15	20	20
6	2		0	0	6	12	12	18	20	21
10	4		0	0	6	12	12	18	20	22

not pick 4th ele \rightarrow we have to ask our first 3 ele to go & fill the bag of cap = 3
 $\Rightarrow \underline{\underline{12}}$
 & generate max value

pick 4th ele = 6 + rem bag cap = 1
ask 3 ele to go & fill the bag of cap=1 & gen max value

$dp[i][j] = \text{max value that we can generate using } i \text{ elements & } j \text{ as bag capacity}$

$$dp[i][j] = \max \left(dp[i-1][j], \underbrace{val[i-1] + dp[i-1][j - wt[i-1]]}_{\text{if } (j - wt[i-1]) \geq 0} \right)$$

↑
not pick

* for ($i=0$; $i < n$; $i++$)

TC: $O(n * k)$

SC: $O(n * k)$

for ($j=0$; $j < m$; $j++$) {

 if ($i == 0$ || $j == 0$) $dp[i][j] = 0$

 else {

$rej = dp[i-1][j]$

$sel = 0$

 if ($j \geq wt[i-1]$)

$select = val[i-1] + dp[i-1][j - wt[i-1]]$;

 3

$dp[i][j] = \max(rej, select)$;

 3

2

return $dp[n][k]$;

Unbounded Knapsack

Given N items each with a weight & value, find max value which can be obtained by picking items such that total weight of all items $\leq K$

Note 1 :- Every item can be picked infinite no. of times

Note 2 :- We cannot take a part of item

Eg:- $N = 4$ items

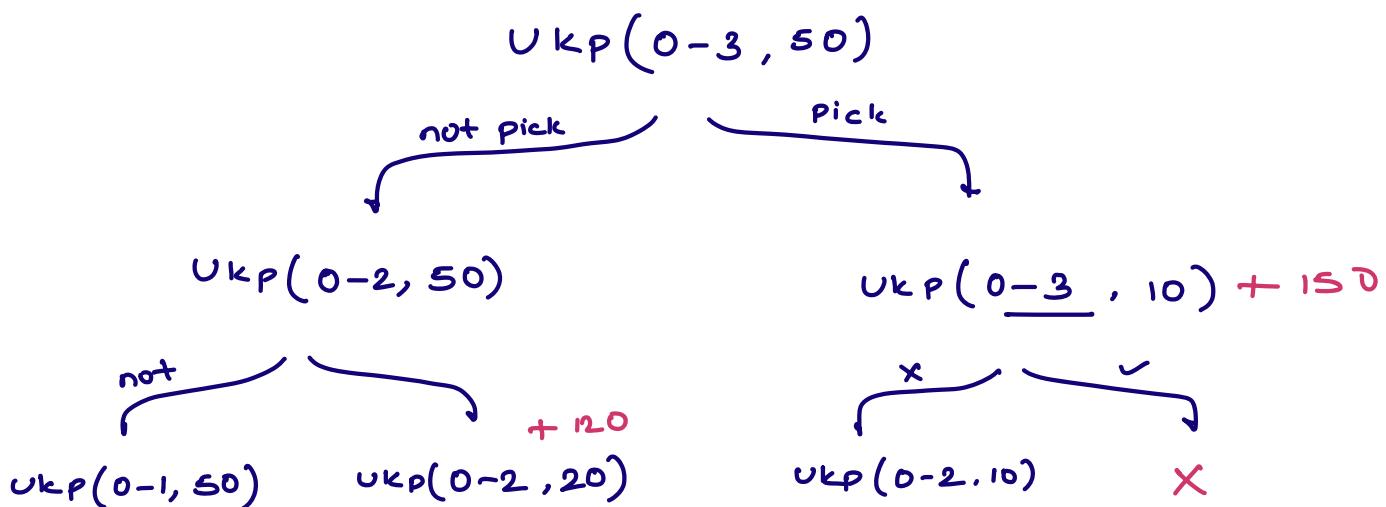
$K = 50$

Items: 0 1 2 3

Weight[]: 20 10 30 40

Value[]: 100 60 120 150

Ans = 300



```

for (i=0; i<n; i++)
    for (j=0; j<m; j++) {
        if (i==0 || j==0) dp[i][j]=0
        else {
            rej = dp[i-1][j]
            sel = 0
            if (j >= wt[i-1])
                select = val[i-1] + dp[i][j-wt[i-1]];
            dp[i][j] = max(rej, select);
        }
    }
return dp[n][k];

```

Q Given 2 strings, find the length of longest common subsequence.

$$S_1 = abc \rightarrow \{a, b, c, ab, ac, abc, bc\} \quad \underline{\text{Ans} = 2}$$

$$S_2 = ace \rightarrow \{a, c, e, ac, ae, ace, ce\}$$

$$\begin{array}{l} S_1 = abbc\overset{d}{g}\overset{h}{h} \\ S_2 = b\overset{a}{c}h\overset{e}{g}\overset{f}{f} \end{array} \left. \begin{array}{l} \\ \{ach, acg, bg\} \end{array} \right\} \underline{\text{Ans} = 3}$$

$$\begin{array}{l} S_1 = abbc\overset{d}{g}\overset{f}{f} \\ S_2 = a\overset{ch}{e}\overset{g}{g}\overset{f}{f} \end{array} \left. \begin{array}{l} \{acgf\} \end{array} \right\} \underline{\text{Ans} = 4}$$

$$S_1 = \underset{0}{a} \underset{1}{b} \underset{2}{b} \underset{3}{c} \underset{4}{d} \underset{5}{g} \underset{6}{f}$$

$$S_2 = \underset{0}{a} \underset{1}{c} \underset{2}{h} \underset{3}{e} \underset{4}{g} \underset{5}{f}$$

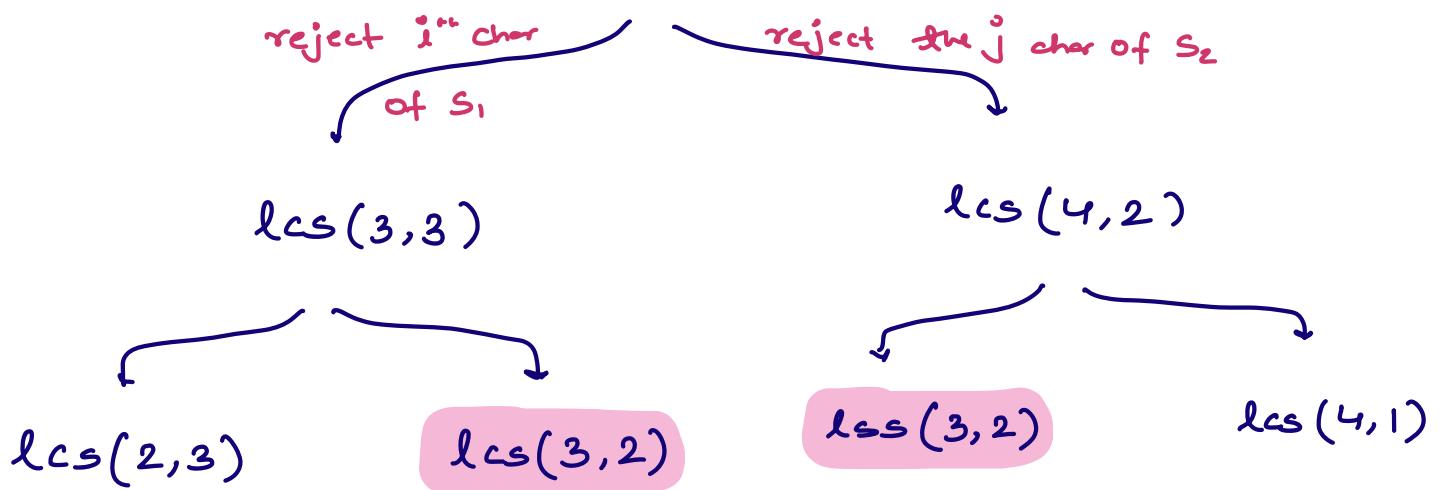
$$\text{lcs}(6, 5)$$

$$\downarrow \quad \text{if } (S_1[6] == S_2[5])$$

$$\text{lcs}(5, 4) + 1$$

$$\downarrow \quad S_1[6] == S_2[4]$$

$$\text{lcs}(4, 3) + 1$$



$$\text{lcs}(i, j) = \begin{cases} \text{lcs}(i-1, j-1) + 1 & \text{if } s_1[i] == s_2[j] \\ \max \left\{ \begin{array}{l} \text{lcs}(i-1, j) \\ \text{lcs}(i, j-1) \end{array} \right\} & \text{if } s_1[i] \neq s_2[j] \end{cases}$$

`int [][] dp = new int[n][m]` $\xrightarrow{\text{C++}}$

`int lcs (String s1, String s2, int i, int j)`

```

if (i < 0 || j < 0) return 0;
if (dp[i][j] != -1) return dp[i][j];
ans = 0
  
```

`if (s1[i] == s2[j]) {`

`ans = lcs (s1, s2, i-1, j-1) + 1`

`}`

`else {`

`int a = lcs (s1, s2, i-1, j);`

TC: $O(n*m)$

SC: $O(n*m)$

```
int b = lcs(s1, s2, i, j-1);
```

```
ans = Max(a, b)
```

```
db[i][j] = ans;
```

```
return ans;
```

$db[i][j]$ = max length of common subsequence
in $(0-i)$ of s_1 & $(0-j)$ of s_2

		a	c	h	e	g	f
		0	1	2	3	4	5
a	0	1	1	1	1	1	1
b	1	1	1	1	1	1	1
b	2	1	1	1	1	1	1
c	3	1	2	2	2	2	2
d	4	1	2	2	2	2	2
g	5	1	2	2	2	3	3
f	6	1	2	2	2	3	4

ab, ach
a, ach ab, ac

```

for (i=0; i<n; i++)
    for (j=0; j<m; j++)
        if (s1[0] == s2[0])
            dp[0][0] = 1;
        else if (j==0)
            if (s1[i] == s2[j]) dp[i][j] = 1
            else dp[i][j] = dp[i-1][j];
        else if (i==0)
            if (s1[i] == s2[j]) dp[i][j] = 1
            else dp[i][j] = dp[i][j-1];
        else {
            if (s1[i] == s2[j])
                dp[i][j] == dp[i-1][j-1] + 1;
            else
                dp[i][j] = max (dp[i-1][j], dp[i][j-1]);
        }
    }
}
return dp[n-1][m-1];

```

Q Given a string, find longest palindromic subsequence

A = " scalar " Ans = 3

A = " abcd e f b " Ans = 3

A = " ab d c g b a " Ans = 5

palindrome of A = palindrome of reverse of A

$S_1 = \text{scalar}$
 $S_2 = \text{r a l a c s}$

} find LCS $\rightarrow 3$

A = abcd e f b
B = b f e d c b a

} Ans = 3

A = ab d c g b a
B = a b g c d b a

} Ans = 5

Q Given 2 strings s_1 & s_2 , find min operations to be performed in s_1 so that it becomes equal to s_2 .

Operations allowed

01. Insert → we can insert any character
02. Replace → we can replace any character
03. Delete → we can delete any character

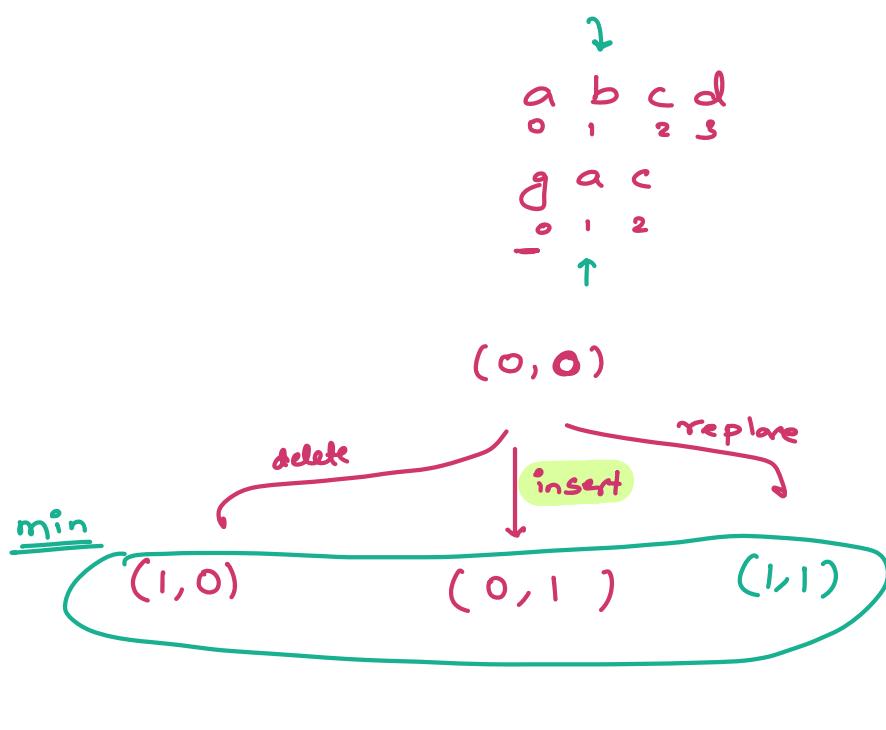
Eg:- $s_1 = \cancel{d} f \cancel{a} \cancel{c} l \xrightarrow{g}$
 $s_2 = f g l$

→ delete d
→ delete a
→ replace c } Ans = 3

Eg:- $s_1 = \cancel{d} f \cancel{a} \cancel{c} \cancel{x} z$
 $s_2 = f x z$

} Ans = 4

$s_1 = \begin{matrix} 0 & 1 & 2 & 3 & 4 \\ d & f & a & c & l \end{matrix}$
 $s_2 = \begin{matrix} 0 & 1 \\ f & g & l \end{matrix}$



$\text{ed}(4, 2)$

$$s_1[4] == s_2[2]$$

$\text{ed}(3, 1)$

$$\text{ans} = \min(a, b, c) + 1;$$

'insert'

$\text{ed}(3, 0)$

$$\begin{aligned}s_1 &= dfacg \\ s_2 &= fg\end{aligned}$$

delete

$\text{ed}(2, 1)$

$$\begin{aligned}s_1 &= dfac\cancel{a} \\ s_2 &= fg\end{aligned}$$

'replace'

$\text{ed}(2, 0)$

$$\begin{aligned}s_1 &= dfac \\ s_2 &= fg\end{aligned}$$

$$\text{if } s_1[i] == s_2[j]$$

$$(i-1, j-1) + 0$$

$\ast(i, j)$

$$\text{Min} \left\{ \begin{array}{l} \text{insert } (i, j-1) \\ \text{delete } (i-1, j) \\ \text{replace } (i-1, j-1) \end{array} \right\} + 1;$$

`int [][]dp = new int [n][m] → -1`

```

int ed (String s1, s2, i, j)
{
    if (i < 0 & j < 0) return 0;
    if (i < 0) return j+1 // j+1 no. of char to insert
    if (j < 0) return i+1 // i+1 char to be deleted
    if (dp[i][j] != -1) return dp[i][j];
    int ans = 0
    if (s1[i] == s2[j])
        ans = ed(s1, s2, i-1, j-1);
    else {
        int a = ed(s1, s2, i, j-1); // insert
        int b = ed(s1, s2, i-1, j); // delete
        int c = ed(s1, s2, i-1, j-1); // replace
        ans = min(a, b, c) + 1;
    }
    dp[i][j] = ans;
    return ans;
}

```

TC : O(n*m)

SC : O(n*m)