



Dynamic Programming

Checklist

- 1. Memoization & Tabulation**
- 2. 1D DP Problems**
- 3. 2D DP Grid Problems**
- 4. Knapsack & Unbounded Knapsack Problems**
- 5. DP on Strings**
- 6. MCM problems and DP on Trees**

What is Dynamic Programming?



↓
misleading name
Advanced / Optimized Recursion

Prerequisite:

- 1) Recursion → Basics, Understanding, multiple calls
- 2) Arrays, 2D arrays → Basics
- 3) Hashmaps & Trees → Basics

Ques:

Q : Fibonacci Number (Recursion)

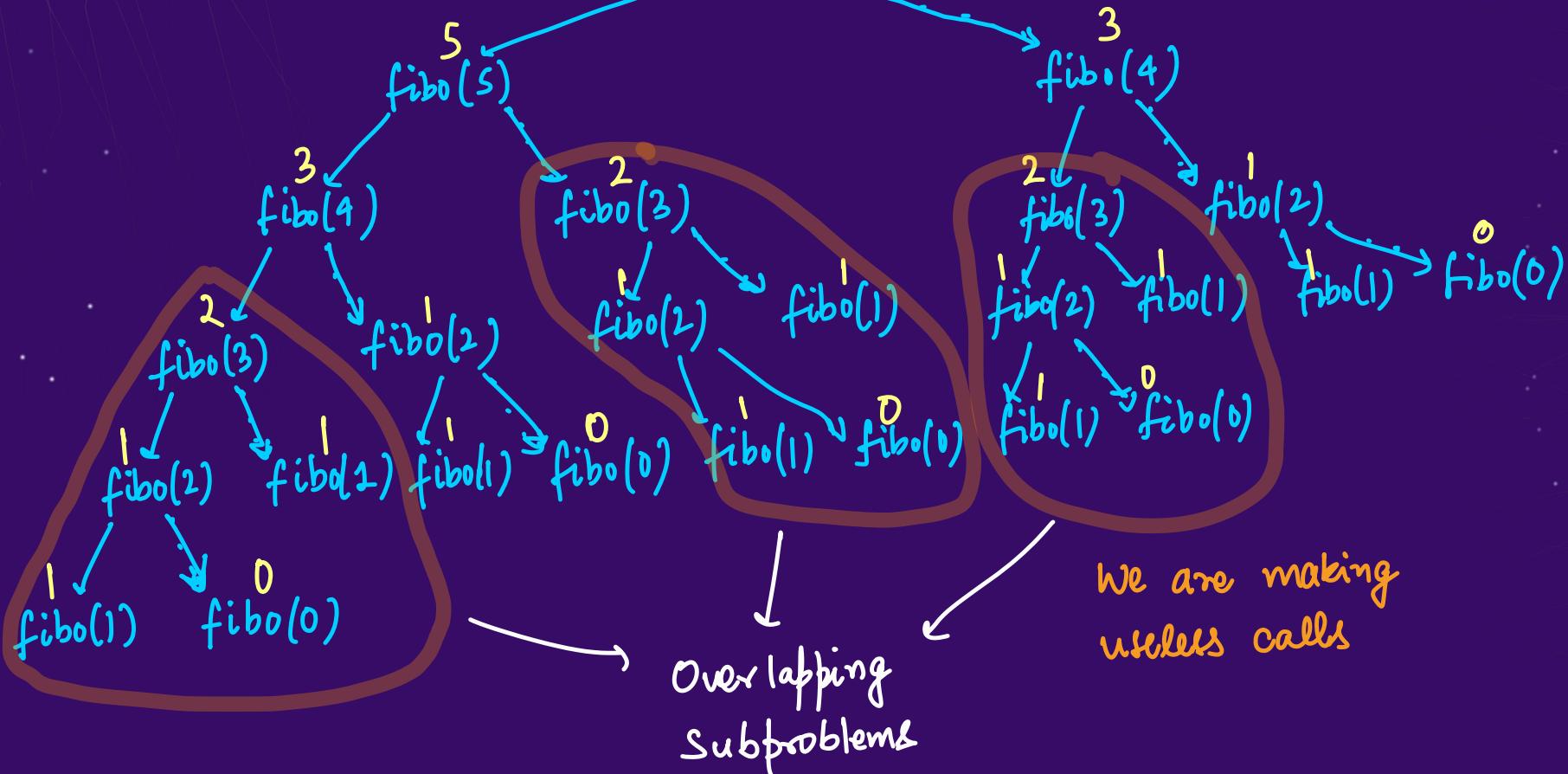
0	1	1	2	3	5	8	13	21	34	55	89	...
n =	0	1	2	3	4	5	6	7	8	9	10	11

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

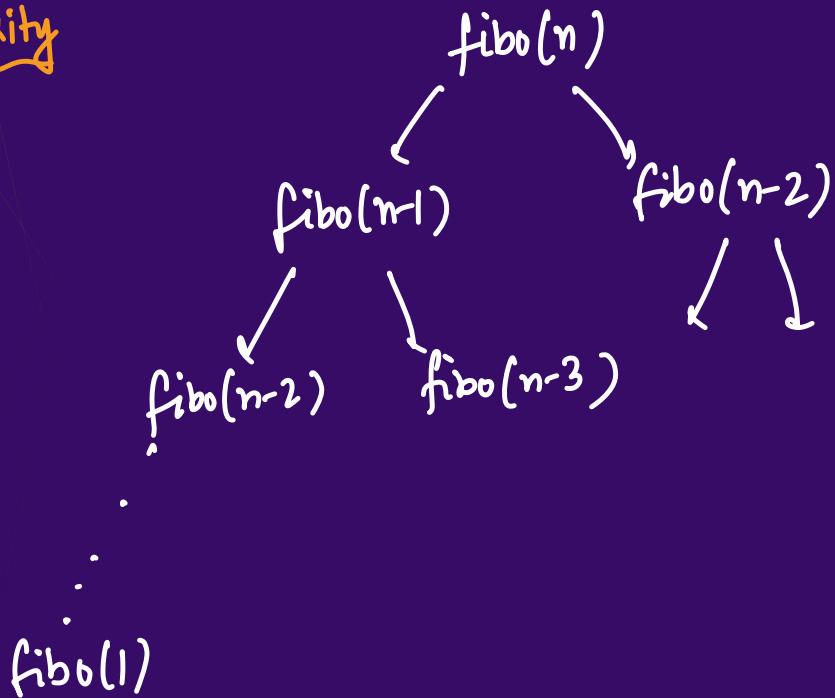
$n=6$

$\text{fib}_0(6)$

T.C. = $O(2^n)$
S.C. = $O(n)$



Time Complexity Discussion



For Calculating T.C.
count the total no. of calls

$$1 + 2 + 4 + 8 + \dots + 2^{n-1} \\ \cong \underline{2^n}$$

It is a balanced binary tree with 'n' levels

So, no. of nodes/calls are approximately $\underline{2^n}$

$$O(\log n) > O(n) > O(n \log n) > O(n^2) > O(n^2 \log n) > O(n^3) >> O(2^n)$$

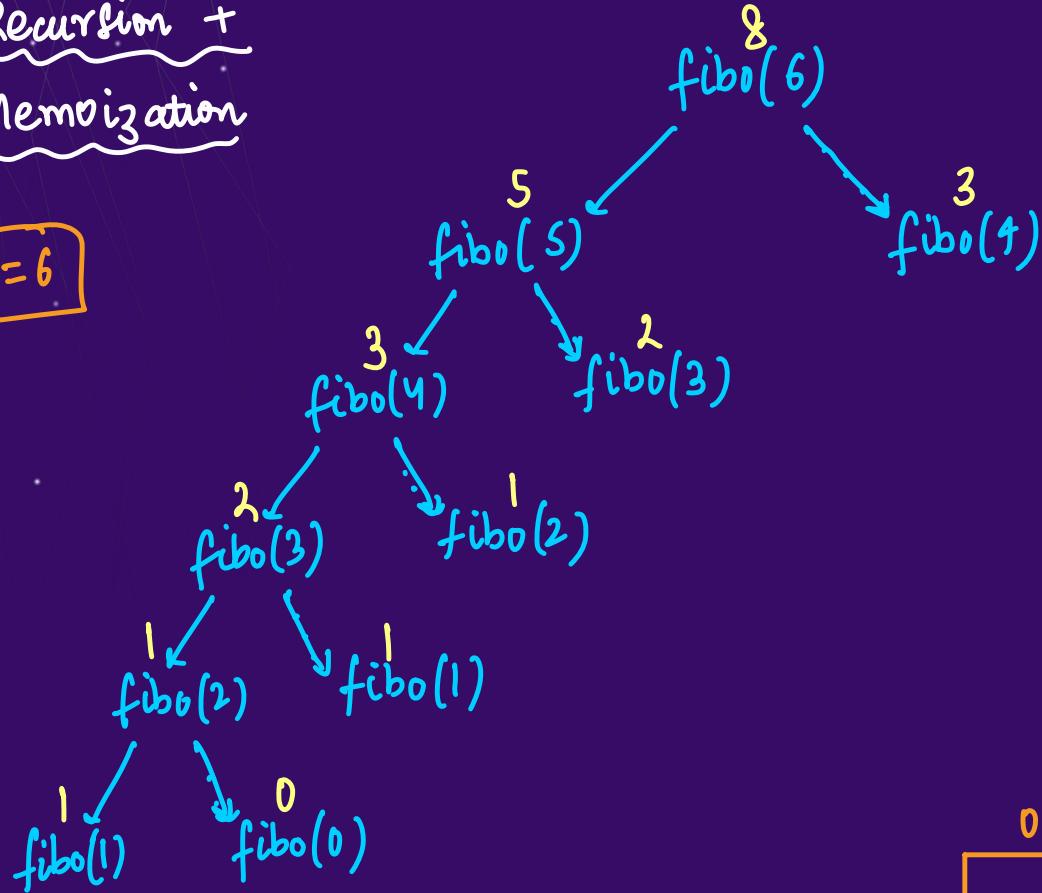
↓

very

slow

Recursion + Memoization

n=6



Time Complexity :

Total Call $\rightarrow 2n - 1$

T.C. = $O(n)$

S.C. = $O(n)$

0	1	2	3	4	5	6
		1	2	3	5	8

Ques:

Q : Fibonacci Number (Recursion + Memoization)

```
public int fibo(int n, int[] dp) {  
    if(n<=1) return n;  
    if(dp[n]!=0) return dp[n];  
    return dp[n] = fibo(n-1,dp) + fibo(n-2,dp);  
}  
public int fib(int n) {  
    int[] dp = new int[n+1]; // index from 0 to n  
    return fibo(n,dp);  
}
```

[Leetcode 509]

Recursion + Memoization = Top - Down DP = Recursive DP

Ques:

Bottom-up DP = Iterative DP
↑



Q : Fibonacci Number (Tabulation)

$n = 8$

T.C. = $O(n)$
S.C. = $O(n)$

	0	1	2	3	4	5	6	7	8
dp	0	1	1	2	3	5	8	13	21

→

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

DP → Using previous results to compute new result

[Leetcode 509]

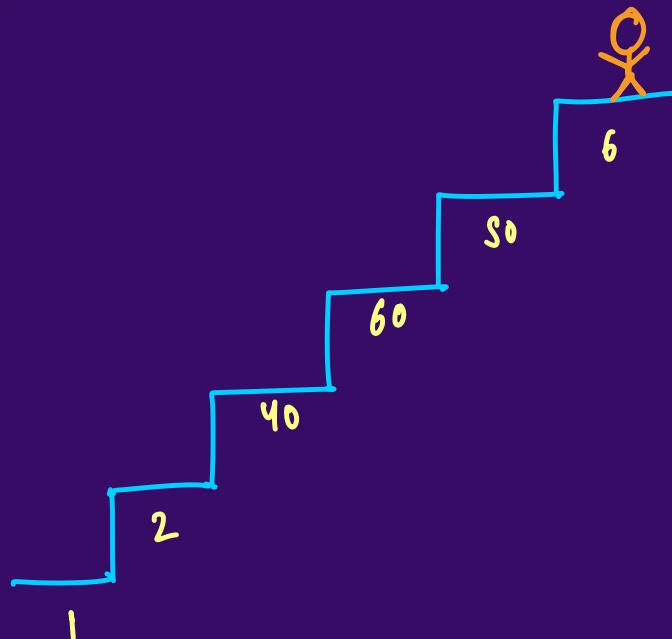
Ques: $\text{minCost}(i) = \text{arr}[i] + \min(\text{minCost}(i-1), \text{minCost}(i-2))$



SKILLS

Q : Min Cost Climbing Stairs

$$\text{cost} = \{ 1, 2, 3, 4, 50, 6 \}$$



$$\begin{aligned}\text{greedy(cost)} &= 6 + 50 + 40 + 1 \\ &= 97\end{aligned}$$

$$\begin{aligned}\text{minCost} &= 60 + 2 \\ &= 62\end{aligned}$$

[Leetcode 746]

Ques:

Q : Min Cost Climbing Stairs Recursion → TLE

```
public int minCost(int[] cost, int idx) {  
    if(idx==0 || idx==1) return cost[idx];  
    return cost[idx] + Math.min(minCost(cost, idx-1),minCost(cost, idx-2));  
}  
public int minCostClimbingStairs(int[] cost) {  
    int n = cost.length;  
    return Math.min(minCost(cost,n-1),minCost(cost,n-2));  
}
```

$$T.C. = O(2^n)$$

A.S. = O(n) → Recursive Stack Space

Ques:

Q : Min Cost Climbing Stairs *Memoization*

```
public int minCost(int[] cost, int idx, int[] dp) {  
    if(idx==0 || idx==1) return cost[idx];  
    if(dp[idx]!=-1) return dp[idx];  
    return dp[idx] = cost[idx] + Math.min(minCost(cost,idx-1,dp),minCost(cost,idx-2,dp));  
}  
public int minCostClimbingStairs(int[] cost) {  
    int n = cost.length;  
    // n is going from n-1 to 0  
    int[] dp = new int[n];  
    Arrays.fill(dp,-1);  
    return Math.min(minCost(cost,n-1,dp),minCost(cost,n-2,dp));  
}
```

$$T.C. = O(n)$$

$$A.S. = O(n)$$

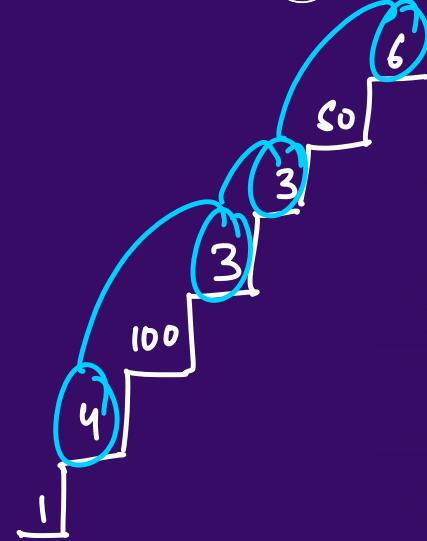
[Leetcode 746]

Ques:

Q : Min Cost Climbing Stairs (Tabulation)

$$\text{cost} = \{ 1, 4, 100, 3, 3, 50, 6 \}$$

$$\text{dp} = \{ 1, 4, 101, 7, 10, 57, 16 \}$$



$$\text{dp}[i] = \text{cost}[i] + \min(\text{dp}[i-1], \text{dp}[i-2])$$

[Leetcode 746]

Ques:

Q : Min Cost Climbing Stairs (*Tabulation*)

```
public int minCostClimbingStairs(int[] cost) {  
    int n = cost.length;  
    int[] dp = new int[n];  
    dp[0] = cost[0]; dp[1] = cost[1];  
    for(int i=2;i<n;i++){  
        dp[i] = cost[i] + Math.min(dp[i-2],dp[i-1]);  
    }  
    return Math.min(dp[n-2],dp[n-1]);  
}
```

T.C. = $O(n)$

A.S. = $O(n)$

Homework:

Q : Nth Tribonacci Number



- 1) Recursion
- 2) Recursion + Memoization
- 3) Tabulation

Ques:

Q : House Robber

→ Max^m amount that can be stolen

arr = 5  6 20  1



take & skip
algorithm

Greedy Approach:

$$5 + 6 + 22 = 33 \quad \times$$

$$15 + 20 + 1 = 36$$

Max Amount : $15 + 22 = 37 \quad \checkmark$

[Leetcode 198]

Ques:

Q : House Robber (Recursion + Memoization)

```
public int amount(int[] nums, int i, int[] dp) {  
    if(i>=nums.length) return 0;  
    if(dp[i]!=-1) return dp[i];  
    int take = nums[i] + amount(nums,i+2,dp);  
    int skip = amount(nums,i+1,dp);  
    return dp[i] = Math.max(take,skip);  
}  
public int rob(int[] nums) {  
    // 'i' varies from 0 to n-1  
    // dp[i] will store the value of amount(i)  
    int[] dp = new int[nums.length]; Arrays.fill(dp,-1);  
    return amount(nums,0,dp);  
}
```

Ques:

Q : House Robber (Tabulation)

$$dp[0] = arr[0]$$

$$dp[1] = \max(arr[0], arr[1])$$

arr =	5	15	6	20	22	1
-------	---	----	---	----	----	---

dp =	5	15	15	35	37	37
------	---	----	----	----	----	----

$$dp[i] = \max(\text{arr}[i] + dp[i-2], dp[i-1])$$

take

skip

$dp[i]$ stores the \max^m money that the robber can rob from 0ⁿ to ith house

[Leetcode 198]

Ques:

Q : House Robber (Tabulation) (Bottom - Up DP)

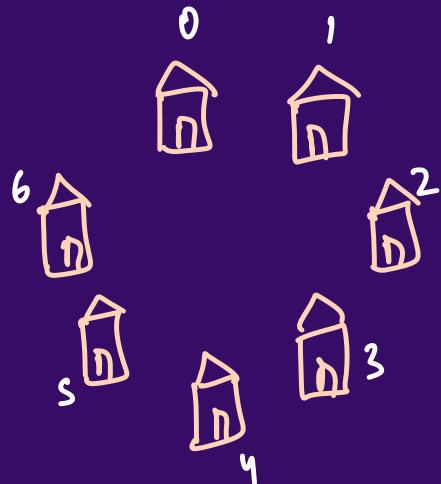
```
public int rob(int[] arr) {  
    int n = arr.length;  
    int[] dp = new int[n];  
    dp[0] = arr[0];  
    if(n>1) dp[1] = Math.max(arr[0],arr[1]);  
    for(int i=2;i<n;i++){  
        dp[i] = Math.max(arr[i]+dp[i-2], dp[i-1]);  
    }  
    return dp[n-1];  
}
```

Homework:

Q : House Robber II

↓

Street is circular



[Leetcode 213]

Ques:

Q : Friends Pairing Problem

you are given a number 'n'. Denoting that there are 'n' friends

Find out the no. of ways in which a person can either pair up or stay single.

Ex : a , b , c , d

$$\Rightarrow ab, cd \Rightarrow ac, bd \Rightarrow ad, bc$$

$$\Rightarrow ab, c, d \Rightarrow ac, b, d \Rightarrow ad, b, c$$

$$\Rightarrow cd, a, b \Rightarrow bd, a, c \Rightarrow bc, a, d$$

$$\Rightarrow a, b, c, d$$

Ques:

↗ recursive formula

Q : Friends Pairing Problem

$$n=3$$

a, b, c



a, b, c

ab, c

ac, b

bc, a

$$n=4$$

a, b, c, d

a (b, c, d)

a, b, c, d
a, bc, d

a, bd, c

a, cd, b

ab (cd)

ab, cd
ab, c, d

ac (db)

ac, bd
ac, b, d

ad (bc)

ad, bc

ad, b, c

$\boxed{\text{pair}(n) = \text{pair}(n-1) + (n-1)^4 \text{pair}(n-2)}$

Ques:

Q : Friends Pairing Problem

generate all permutations

$ab \neq ba$



$$\text{pairing}(n) = n^* [\text{pairing}(n-1) + (n-1)^* \text{pairing}(n-2)]$$

$\left[\begin{array}{ll} \text{single} & \text{pair} \\ \text{nahi} & \\ \text{hoga} & \end{array} \right]$

$$\begin{aligned}\text{pair}(4) &= 4^* [\text{pair}(3) + 3^* \text{pair}(2)] \\ &= 4 [4 + 6] = 4[10] = 40 \text{--- wrong}\end{aligned}$$

Ques:

Q : Friends Pairing Problem (Recursion + Memoization)

```
public static void main(String[] args) {
    Scanner sc = new Scanner(System.in);
    int n = sc.nextInt();
    int[] dp = new int[n+1];
    Arrays.fill(dp,-1);
    System.out.println(pair(n,dp));
}
```

```
private static int pair(int n, int[] dp) {
    if(n<=2) return n;
    if(dp[n]!=-1) return dp[n];
    return dp[n] = pair(n-1,dp) + (n-1)*pair(n-2,dp);
}
```

T.C. = $O(n)$

S.C. = $O(n)$

Ques:

Q : Friends Pairing Problem (Tabulation)

$$n = 6$$

0	1	2	3	4	5	6	
dp		1	2	4	10	26	76

```

private static int friend(int n) {
    int[] dp = new int[n+1];
    dp[1] = 1;
    if(n>1) dp[2] = 2;
    for(int i=3;i<=n;i++){
        dp[i] = dp[i-1] + (i-1)*dp[i-2];
    }
    return dp[n];
}
  
```

$$\text{pair}(n) = \text{pair}(n-1) + (n-1)^* \text{pair}(n-2)$$

$$dp[i] = dp[i-1] + (i-1)^* dp[i-2]$$

$$T.C. = O(n)$$

$$A.S. = O(n)$$

Homework:

$$n! \left(\frac{1}{n!} - \frac{1}{(n-1)!} + \frac{1}{(n-2)!} \dots \right)$$

Q : Count Derangements

$$n = 5$$

there are ' n ' postcards & ' n ' houses

The postman delivers postcards to every house

such that each person does not get his/her postcard \rightarrow No. of ways



Homework:

Q : Count Derangements

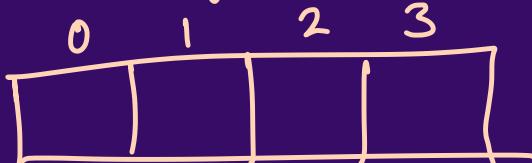
$$\frac{3}{1} \quad \frac{1}{2} \quad \frac{2}{3}$$

$$\frac{\cancel{1}}{1} \quad n=1 \rightarrow 0$$

$$\frac{2}{1} \quad \frac{1}{2} \quad n=2 \rightarrow 1$$

$$\frac{2}{1} \quad \frac{3}{2} \quad \frac{1}{3}$$

hint \rightarrow array



$n=3 \rightarrow 2$

$n=4$

Homework:

Q: Climbing Stairs

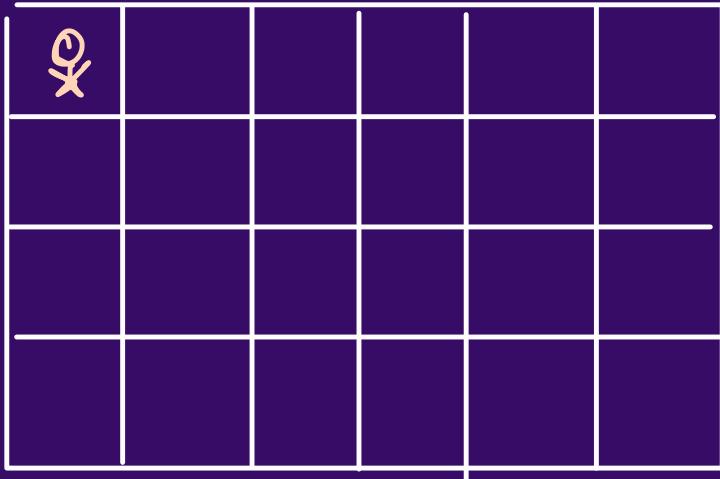
- Recursion
- Recursion + Memoization
- Tabulation

[Leetcode - 70]

Ques:

Q : Unique Paths → $m \times n$ where there is a

$m \times n$ grid



4×6

$$\text{ways}(m, n) = \text{ways}(m-1, n) + \text{ways}(m, n-1)$$

down right

[Leetcode 62]

the person has to
reach $(m-1, n-1)$ from $(0, 0)$
only using right & down
at a time.

Ques:

Q : Unique Paths

```

public int uniquePaths(int m, int n) {
    // row : 0 to m-1 | col : 0 to n-1
    int[][] dp = new int[m][n];
    for(int i=0;i<m;i++){
        for(int j=0;j<n;j++){
            dp[i][j] = -1;
        }
    }
    return paths(0,0,m,n,dp);
}

private int paths(int row, int col, Integer m, Integer n, int[][][] dp) {
    if(row>=m || col>=n) return 0;
    if(row==m-1 && col==n-1) return 1;
    if(dp[row][col]!=-1) return dp[row][col];
    int rightWays = paths(row,col+1,m,n,dp);
    int downWays = paths(row+1,col,m,n,dp);
    return dp[row][col] = rightWays + downWays;
}

```

$$T.C. = O(m \cdot n)$$

$$A.S. = O(m \cdot n)$$

Ques:

Q : Unique Paths (Tabulation)

Right or Down

X	1	1	1	1	1
1	2	3	4	5	6
dp	1	3	6	10	15
1	4	10	20	35	56

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

[Leetcode 62]

Ques:

Q : Unique Paths (*Tabulation*)

```
public int uniquePaths(int m, int n) {
    int[][] dp = new int[m][n];
    for(int i=0;i<m;i++){
        for(int j=0;j<n;j++){
            if(i==0 || j==0) dp[i][j] = 1;
            else dp[i][j] = dp[i][j-1] + dp[i-1][j];
        }
    }
    return dp[m-1][n-1];
}
```

T.C. = $O(m \times n)$

S.C. = $O(m \times n)$

Ques:

Prefix Sum



Q : Minimum Path Sum (Tabulation)

2	3	9	4
8	4	1	2
2	1	3	3

arr

2	5	14	18
10	9	10	12
12	10	13	15

dp

$$dp[i][j] = arr[i][j] + \min(dp[i-1][j], dp[i][j-1])$$

[Leetcode 64]

Homework:

Q : Minimum Path Sum (Recursion + Memoization)

Top-Down DP

[Leetcode 64]

Homework:

Q: Unique Paths II

0	0	0	1	0	0	0
0	1	0	0	1	0	0
0	0	1	0	0	0	0

Hint \Rightarrow PS \rightarrow -1

[Leetcode 63]

Ques:

Q : Count Square Submatrices with all Ones (Tabulation)

0	1	1	1
1	1	1	1
0	1	1	1

0	1	1	1
1	1	2	2
0	1	2	3

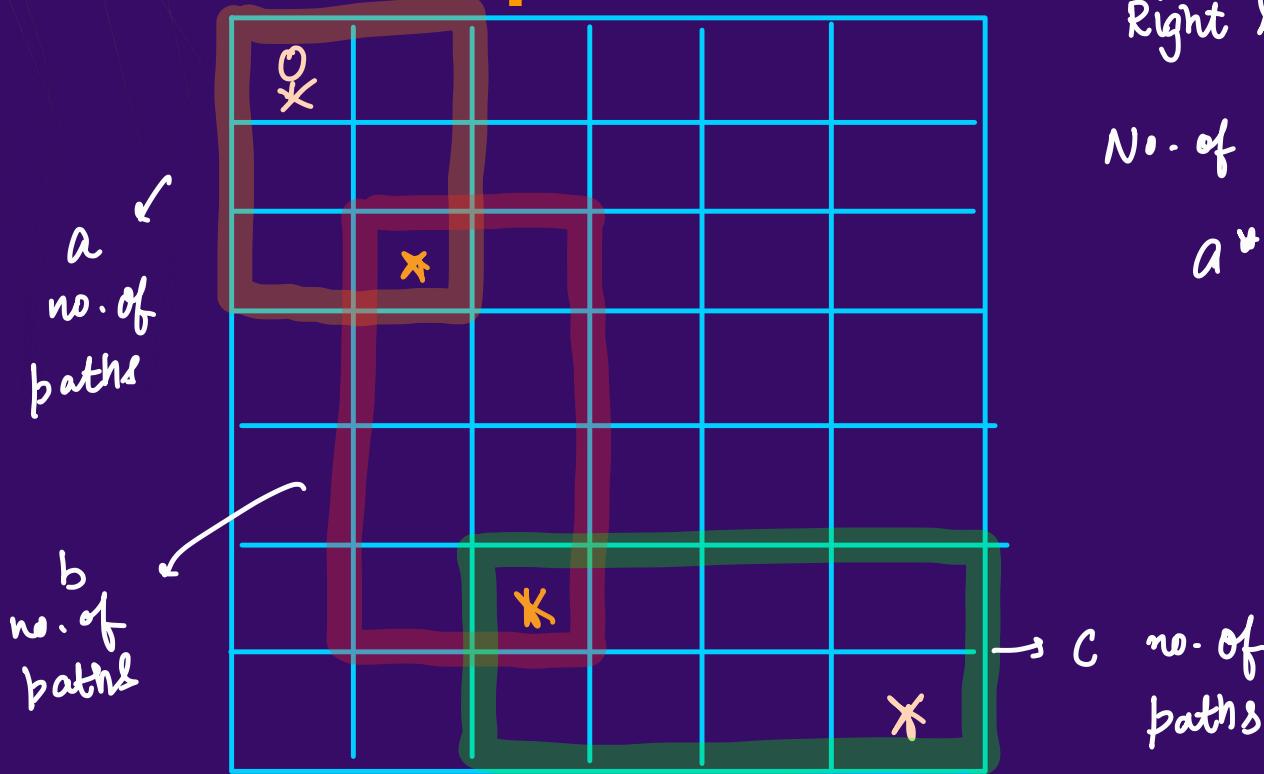
arr

Count = sum
of
this
matrix

$\text{arr}[i][j]$ = the side of square whose bottom right corner is i, j

[Leetcode 1277]

Paths which passes through certain checkpoints



Space Optimisation

Abhi tak,

1D DP \rightarrow 'n' size array (dp) Space $O(n) \rightarrow O(1)$

2D DP \rightarrow ' $m \times n$ ' size 2D array (dp) Space $O(m \times n) \rightarrow O(m) / O(n)$

Ques:

Q : Fibonacci Number (Tabulation) (Space Optimization)

$n = 8$

(21)

dp	0	1	2
	13	21	21

$$dp[2] = dp[0] + dp[1]$$

T.C. = $O(n)$

S.C. = $O(1)$

$$dp[0] = dp[1]$$

$$dp[1] = dp[2]$$

[Leetcode 509]

Ques:

Q : Fibonacci Number (Tabulation)

[Leetcode 509]

Ques:

Q : Unique Paths (Tabulation)

X	1	1	1	1	1
1	2	3	4	5	6
1	3	6	10	15	21
1	4	10	20	35	56
1	5	15	35	70	126

dp

$m \times n$

0	1	5	15	35	70	126
1	1	4	10	20	35	56

$m-1$ times
loop

$$dp[1][j] = dp[1][j-1] + dp[0][j]$$

[Leetcode 62]

Ques:

Q : Unique Paths

```
public int uniquePaths(int m, int n) {
    int[][] dp = new int[2][n];
    for(int j=0;j<n;j++){
        dp[0][j] = 1;
        dp[1][j] = 1;
    }
    for(int i=1;i<=m-1;i++){ // m-1 times
        // DP wala kaam
        for(int j=1;j<n;j++){
            dp[1][j] = dp[1][j-1] + dp[0][j];
        }
        // copy the 1st row to 0th row
        for(int j=1;j<n;j++){
            dp[0][j] = dp[1][j];
        }
    }
    return dp[1][n-1];
}
```

2nd Best

Best

```
public int uniquePaths(int m, int n) {
    int[][] dp = new int[2][n];
    for(int j=0;j<n;j++){
        dp[0][j] = 1;
        dp[1][j] = 1;
    }
    for(int i=1;i<=m-1;i++){ // m-1 times
        if(i%2==1){
            for(int j=1;j<n;j++){
                dp[1][j] = dp[1][j-1] + dp[0][j];
            }
        } else{
            for(int j=1;j<n;j++){
                dp[0][j] = dp[0][j-1] + dp[1][j];
            }
        }
    }
    return Math.max(dp[1][n-1],dp[0][n-1]);
}
```

[Leetcode 62]

Ques:

Q : Perfect Squares

$$n = a + b + c \dots$$

L L L

perfect squares

ans = min count of these

n	PW SKILLS
3 = 1+1+1	3
4 = 4	1
5 = 1+4	2
6 = 1+1+4	3
7 = 1+1+1+4	4
8 = 4+4	2
9 = 9	1

[Leetcode 279]

Ques:

Q : Perfect Squares

$$12 \rightarrow 1+11 \rightarrow 1+3 = 4$$

$$2+10$$

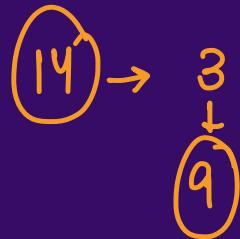
$$3+9$$

$$4+8$$

$$5+7$$

$$6+6$$

$$11 = 4 + 1 + 1$$



$$\begin{aligned} \text{numSquares}(n) &= \text{numSquares}(1) + \text{numSquares}(n-1) \\ &\quad \text{numSq}(2) + \text{numSq}(n-2) \end{aligned}$$

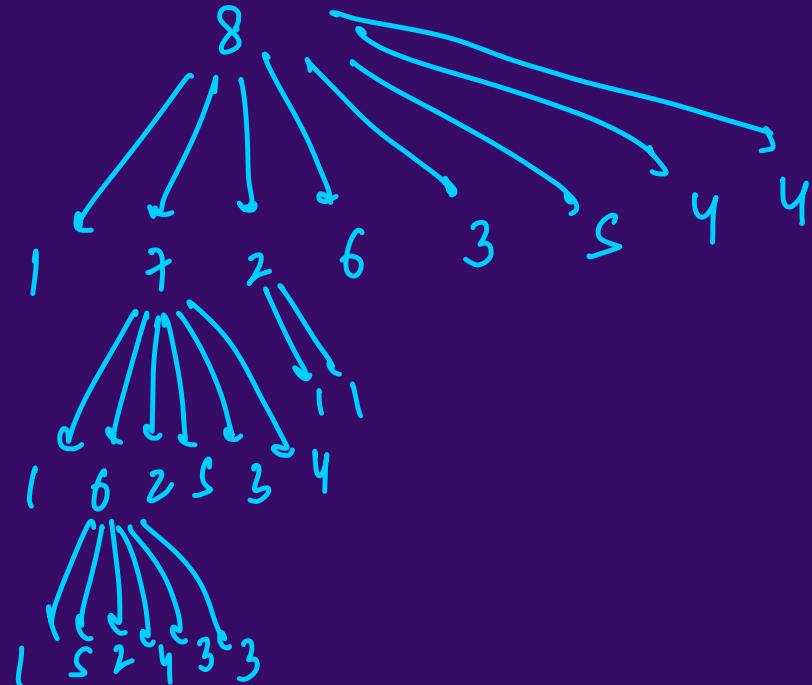
[Leetcode 279]

Ques:

Q : Perfect Squares

$n = 8$

T.C. $\leq \approx O(n^n)$



[Leetcode 279]

$$i < \sqrt{n} \rightarrow i^2 < n$$

Ques:

Q : Perfect Squares (Memoization)

```

public int minSquares(int n, int[] dp) {
    if(isPerfect(n)) return 1;
    if(dp[n]==-1) return dp[n];
    int min = Integer.MAX_VALUE;
    for(int i=1;i<=n/2;i++){
        int count = minSquares(i,dp) + minSquares(n-i,dp);
        min = Math.min(min,count);
    }
    return dp[n] = min;
}
    
```

$$\text{T.C.} = O(n^2)$$

↳

TLE Error

$$\text{S.C.} = O(n)$$

'n' calls

but in every call \rightarrow 'n/2' times the for loop

Ques:

Q : Perfect Squares

$$\begin{aligned} n = 12 &\rightarrow 1 + 11 \\ &2 + 10 \\ &3 + 9 \\ &4 + 8 \\ &5 + 7 \\ &6 + 6 \end{aligned}$$



1, 2, 3



$$n=12 \rightarrow 1 + 11$$

$$2^2 + 12 - 2^2 \text{ or } 4 + 8$$

$$3^2 + 12 - 3^2 \text{ or } 9 + 3$$

$$\minS(n) = \minS(i^2) + \minS(n-i^2)$$

$$\minS(n) = \minS(i) + \minS(n-i)$$

[Leetcode 279]

Ques:

Q : Perfect Squares

```
public int minSquares(int n, int[] dp) {  
    if(isPerfect(n)) return 1;  
    if(dp[n]!=-1) return dp[n];  
    int min = Integer.MAX_VALUE;  
    for(int i=1;i*i<=n;i++){  
        int count = minSquares(i*i,dp) + minSquares(n-i*i,dp);  
        min = Math.min(min,count);  
    }  
    return dp[n] = min;  
}
```

$$T.C. = O(n\sqrt{n})$$

$$S.C. = O(n)$$

Ques:

Q : Perfect Squares (Tabulation)

```

public int numSquares(int n) {
    int[] dp = new int[n+1];
    for(int i=1;i<=n;i++){
        if(isPerfect(i)) dp[i] = 1;
        else{
            int min = Integer.MAX_VALUE;
            for(int j=1;j<=i/2;j++){
                int count = dp[j] + dp[i-j];
                min = Math.min(min,count);
            }
            dp[i] = min;
        }
    }
    return dp[n];
}

```

$$T.C. = O(n^2)$$

$$S.C. = O(n)$$

just
work

```

public int numSquares(int n) {
    int[] dp = new int[n+1];
    for(int i=1;i<=n;i++){
        if(isPerfect(i)) dp[i] = 1;
        else{
            int min = Integer.MAX_VALUE;
            for(int j=1;j*j<=i;j++){
                int count = dp[j*j] + dp[i-j*j];
                min = Math.min(min,count);
            }
            dp[i] = min;
        }
    }
    return dp[n];
}

```

$$T.C. = O(n\sqrt{n})$$

$$S.C. = O(n)$$

gt obviously

work

[Leetcode 279]

Ques:

Try out all possible combinations

Q : 0/1 Knapsack



	Gold	iPhone	Table	Painting
price	5	3	9	16
weight	1	2	8	10
s		1.5	1.1	1.6

$$C = 8$$

$$\text{ans} = 9$$

Objective : To get maximum amount (profit)

$\frac{\text{price}}{\text{weight}}$ \rightarrow Only in
Fractional
Knapsack

[Hackerrank]

Ques:

Q : O/1 Knapsack

```
public static int profit(int i, int[] wt, int[] val, int C){  
    if(i==wt.length) return 0;  
    int skip = profit(i+1,wt,val,C);  
    if(wt[i]>C) return skip;  
    int pick = val[i] + profit(i+1,wt,val,C-wt[i]);  
    return Math.max(pick,skip);  
}
```

$$T.C. = O(2^n)$$
$$A.S. = O(n^*C)$$

Ques:

Q : O/1 Knapsack *(Recursion + Memoization)*

```

public static int profit(int i, int[] wt, int[] val, int C, int[][] dp){
    if(i==wt.length) return 0;
    if(dp[i][C]!=-1) return dp[i][C];
    int skip = profit(i+1,wt,val,C,dp);
    if(wt[i]>C) return dp[i][C] = skip;
    int pick = val[i] + profit(i+1,wt,val,C-wt[i],dp);
    return dp[i][C] = Math.max(pick,skip);
}

public static void main(String[] args) {
    int[] val = {5,3,7,16};
    int[] wt = {1,2,8,10};
    int C = 8;
    int n = wt.length;
    // i = 0 to n-1 | C = C to 0
    int[][] dp = new int[n][C+1];
    for(int i=0;i<dp.length;i++)
        for(int j=0;j<dp[0].length;j++) dp[i][j] = -1;
    System.out.println(profit(0,wt,val,C,dp));
}

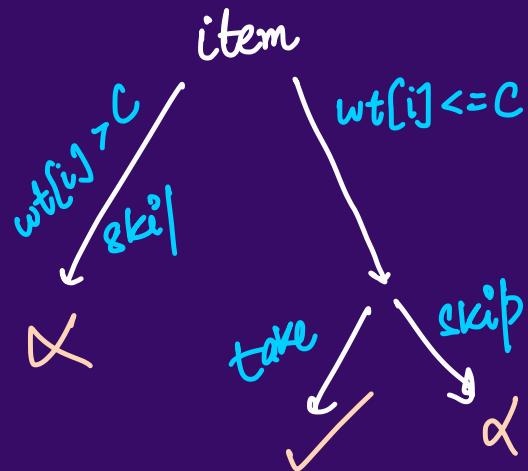
```

$$T.C. = O(n^*C)$$

$$A.S. = O(n^*C)$$

Ques:

Q : O/1 Knapsack



Ques:

Q:

0/1 knapsack
↑

Subset Sum

$$\text{arr} = \{0, 8, 5, 2, 4\} \quad \text{target} = 9$$

tell if there exists a subset of the array with sum = target

Try recursion & try all possible subsets

pick or skip the element

Ques:

Q : Subset Sum

```

private static boolean subset(int i, int[] arr, int target) {
    if(i==arr.length){
        if(target==0) return true;
        else return false;
    }
    boolean skip = subset(i+1,arr,target);
    if(target-arr[i]<0) return skip; // Only valid for +ve numbers
    boolean pick = subset(i+1,arr,target-arr[i]);
    return pick || skip;
}

public static void main(String[] args) {
    int[] arr = {8,-1,2,4};
    int target = 7;
    System.out.println(subset(0,arr,target));
}

```

T.C. = $O(2^n)$

A.S. = $O(n^t)$

Ques:

Q : Subset Sum

```

private static boolean subset(int i, int[] arr, int target, int[][][] dp) {
    if(i==arr.length){
        if(target==0) return true;
        else return false;
    }
    if(dp[i][target]!=-1) return (dp[i][target]==1);
    boolean ans = false;
    boolean skip = subset(i+1,arr,target,dp);
    if(target-arr[i]<0) ans = skip;
    else{
        boolean pick = subset(i+1,arr,target-arr[i],dp);
        ans = pick || skip;
    }
    if(ans) dp[i][target] = 1;
    else dp[i][target] = 0;
    return ans;
}

```

$$T.C. = O(n^4 t)$$

$$A.S. = O(n^4 t)$$

Ques:

Q : Partition equal Subset Sum

↳
0/1 Knapsack

[Leetcode 416]

Ques: → Try out all possible ways

Q : Unbounded Knapsack → Every item has infinite quantity



	Gold	iPhone	Table	Painting
price	6	3	9	25
weight	2	2	8	9
	3	1.5	1.1	2.7

$$C = 9$$

$$\text{maxProfit} = 25$$

0/1 Knapsack

pick →

i+1

Unbounded

i

Ques:

Q : Coin Change (Very famous question)

(Unbounded Knapsack)

amount = 11

coins = {1, 2, 5}



[Leetcode 322]

Ques:

Q : Coin Change \rightarrow try out all possible combinations

amount = 8

coins = { 1, 2, 4, 5 }



$$8 = 5 + 2 + 1 \rightarrow 3 \text{ coins}$$

$$8 = 4 + 4 \rightarrow 2 \text{ coins}$$

[Leetcode 322]

Ques:

~~Q : Coin Change~~

Knapsack general code :

if ($\text{amt} - \text{arr}[i] < 0$) skip

else {

skip & pick

3

↓

'i' in unbounded

'i+1' in O/I

[Leetcode 322]

Homework:

Q : Length of the longest subsequence that sums to target.

arr = { 1, 2, 5, 9, 3, 4, 3 } target = 9

ans = 4

Ques:

Q : Target Sum

$\text{arr} = \{1, 1, 1, 1, 1\}$ $\text{target} = 3$ $\boxed{\text{ways} = 5}$
 $\text{st} = 2 \rightarrow \text{ways} = 0$

$$+1 +1 +1 +1 -1 = 3$$

$$+1 +1 +1 -1 +1 = 3$$

$$+1 +1 -1 +1 +1 = 3$$

$$+1 -1 +1 +1 +1 = 3$$

$$-1 +1 +1 +1 +1 = 3$$

[Leetcode 494]

Ques:

Q : Target Sum

Knapsack → pick or skip strategy

↓ ↓
+ -

[Leetcode 494]

Ques: arr = { 1, 1, 1, 1, 1 }

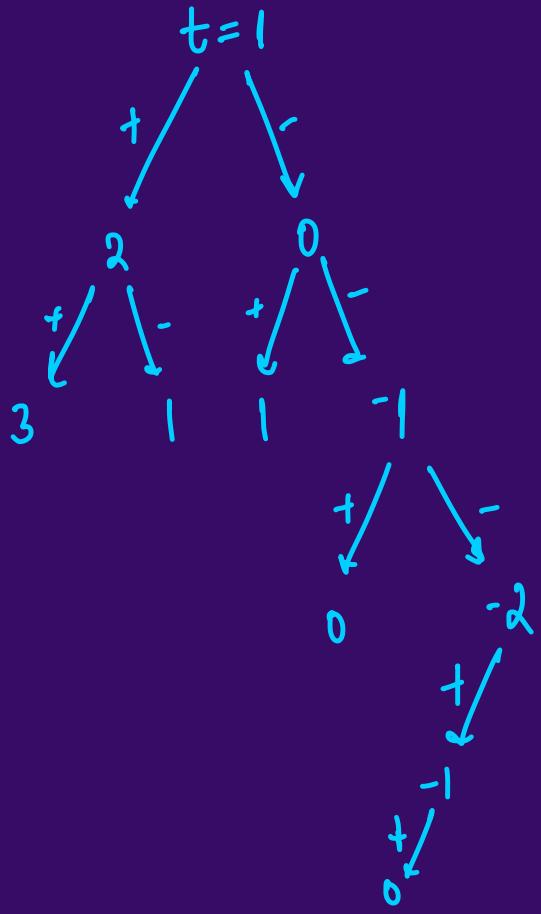
target = 1



Q : Target Sum

dp[i][j]

↓
Stores the
result of a
call in which
 $i \neq j$



dp[5][t+1]

target = -s to s

↓ transform

0 to 2^s

[Leetcode 494]

Ques:

$$S=5$$

$t \rightarrow -S$ to S

Q : Target Sum

<i>target</i>	=	-5	-4	-3	-2	-1	0	1	2	3	4	\leq
		0	1	2	3	4	5	6	7	8	9	10

[Leetcode 494]

Ques:

Q : Target Sum

- We can use hashmap for negative indexing

HashMap < Integer, HashMap<int, value>>



row

number



-ve
as
well



[Leetcode 494]

Homework:

Q : Visit Array positions to maximise score

↓

2D DP

Knapsack type

[Leetcode 2786]

Tabulation in 'Knapsack Problem'

- 1) Thinking of tabulation
- 2) Thinking of Recursion \rightarrow Top - Down \rightarrow convert \rightarrow Bottom Up

Steps :

- 1) $\text{idx} \rightarrow n-1 \text{ to } 0$ instead of $0 \text{ to } n-1$
- 2) Make formula
- 3) pls make sense of the base case

Tabulation

```

public static int profit(int i, int[] wt, int[] val, int C, int[][][] dp){
    if(i<0) return 0;
    if(dp[i][C]==-1) return dp[i][C];
    int skip = profit(i-1,wt,val,C,dp);
    if(wt[i]>C) return dp[i][C] = skip;
    int pick = val[i] + profit(i-1,wt,val,C-wt[i],dp);
    return dp[i][C] = Math.max(pick,skip);
}

```

$$\text{if } \{ \text{wt}[i] > c \} \quad \text{profit}(i, c) = \text{profit}(i-1, c)$$

else

$$\text{profit}(i, c) = \max (\text{val}[i] + \text{profit}(i-1, c - \text{wt}[i]), \text{profit}(i-1, c))$$

$$dp[i][c] = \max (\text{val}[i] + dp[i-1][c - \text{wt}[i]], dp[i-1][c])$$

Tabulation

Bottom Up

```

for(int i=0;i<n;i++){
    for(int j=0;j<C+1;j++){
        int skip = (i>0) ? dp[i-1][j] : 0;
        if(wt[i]>j) dp[i][j] = skip;
        else{
            int pick = val[i];
            pick += ((i>0) ? dp[i-1][j-wt[i]] : 0);
            dp[i][j] = Math.max(pick,skip);
        }
    }
}

```

```

public static int profit(int i, int[] wt, int[] val, int C, int[][][] dp){
    if(i<0) return 0;
    if(dp[i][C]==-1) return dp[i][C];
    int skip = profit(i-1,wt,val,C,dp);
    if(wt[i]>C) return dp[i][C] = skip;
    else{
        int pick = val[i] + profit(i-1,wt,val,C-wt[i],dp);
        return dp[i][C] = Math.max(pick,skip);
    }
}

```

Top - Down

Tabulation

```

long[][] dp = new long[n][amount+1];
for(int i=0;i<dp.length;i++){
    for(int j=0;j<dp[0].length;j++){
        long skip = (i>0) ? dp[i-1][j] : ((j==0) ? 0 : Integer.MAX_VALUE);
        if(j-coins[i]<0) dp[i][j] = skip;
        else{
            long pick = 1 + dp[i][j-coins[i]];
            dp[i][j] = Math.min(skip,pick);
        }
    }
}

long[][] dp = new long[2][amount+1]; // i-1 : 0 & i = 1 -> dp
for(int i=0;i<n;i++){
    for(int j=0;j<amount+1;j++){
        long skip = (i>0) ? dp[0][j] : ((j==0) ? 0 : Integer.MAX_VALUE);
        if(j-coins[i]<0) dp[1][j] = skip;
        else{
            long pick = 1 + dp[1][j-coins[i]];
            dp[1][j] = Math.min(skip,pick);
        }
    }
}
// copy paste 1st row to 0th row
for(int j=0;j<amount+1;j++){
    dp[0][j] = dp[1][j];
}

```

*Space
Optimisation .*

Ques:

Q : Longest Common Subsequence [length]

$m \leftarrow s1 = b \ a \ c \ d \ e \ f$

$n \leftarrow s2 = a \ g \ h \ c \ i \ f$

$\text{ans} = 3$
 $\rightarrow a \ c \ f$

if ($s1[m-1] == s2[n-1]$) $\text{lcs} = 1 + \text{lcs}(\text{0 to } m-2 \text{ of } s1 \text{ & } \text{0 to } n-2 \text{ of } s2)$

else

[Leetcode 1143]

Ques:

Q : Longest Common Subsequence (length)

$s_1 = b \ a \ c \ d \ e \ f \ k$

$s_2 = a \ g \ h \ c \ i \ f \ b$

$bacf \neq acfb$

[Leetcode 1143]

Ques:

Q : Longest Common Subsequence (print)

[Leetcode 1143]

ALGO

$s_1 = b a c d e f$

$s_2 = a g h c i f$



$b a c d e$
a g h c i + 1

max

$(b a c d e , a g h c)' , (b a c d , a g h c i)$



LCS (Recursion + Memoization)

```
public int lcs(int i, int j, StringBuilder a, StringBuilder b, int[][] dp) {  
    if(i<0 || j<0) return 0;  
    if(dp[i][j]!=-1) return dp[i][j];  
    if(a.charAt(i)==b.charAt(j))  
        return dp[i][j] = 1 + lcs(i-1,j-1,a,b,dp);  
    else  
        return dp[i][j] = Math.max(lcs(i-1,j,a,b,dp),lcs(i,j-1,a,b,dp));  
}  
public int longestCommonSubsequence(String text1, String text2) {  
    StringBuilder a = new StringBuilder(text1);  
    StringBuilder b = new StringBuilder(text2);  
    int m = a.length(), n = b.length();  
    // i = m-1 to 0 | j = n-1 to 0  
    int[][] dp = new int[m][n];  
    for(int i=0;i<dp.length;i++)  
        for(int j=0;j<dp[0].length;j++) dp[i][j] = -1;  
    return lcs(m-1,n-1,a,b,dp);  
}
```

$$T.C. = O(m^n)$$

$$A.S. = O(m \times n)$$

Ques: Derivative of LCS
 ↑

Q : Longest Palindromic Subsequence (length)

Hint : 1) LCS

2) Reverse of given string

str = a b c d b f g a g] LCS
 rev = g a g f b d c b a]

LPS(str) = LCS(str, rev(str))
 ↓ ↓
 n n

⇒ T.C. = $O(n^2)$

A.S. = $O(n^2)$

Leetcode 516]

Ques:

$s + rev(s)$ is always a palindrome



Q : Minimum Insertion steps to make string Palindrome

$$s = m b a d m \rightarrow ans = 2$$

1) m b d a d b m $\Rightarrow m b d a d b m$ (2)

2) m d b a b d m $\Rightarrow m d b a b d m$ (2)

Hint-1 : 1) LPS

2) This is a Easy Question

[Leetcode 1312]

Ques:

^{Deletion}
↑

Q : Minimum Insertion steps to make string Palindrome

(a) (b) c (d) (b) f g (a) g

steps = s.length() - LPS(s)

g a gf b c d c b fg a g

ans = 4

[Leetcode 1312]

Homework:

Q : Delete Operation for 2 strings

[Leetcode 583]

Ques:

Q : Edit Distance

a = movie

b = love

Delete

Insert

Replace

- 1) Delete i

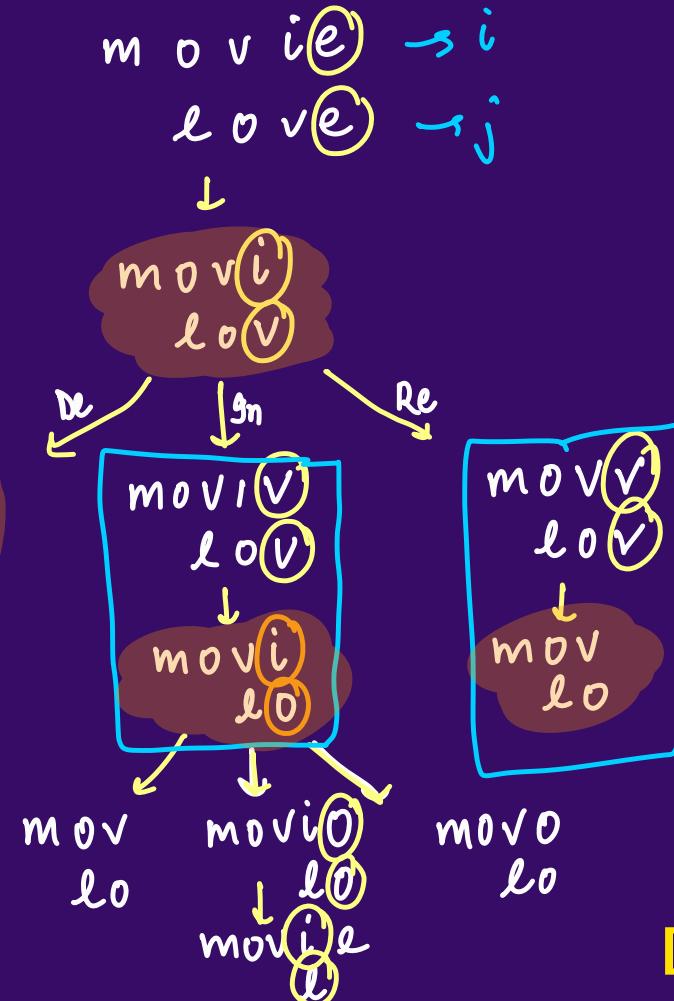
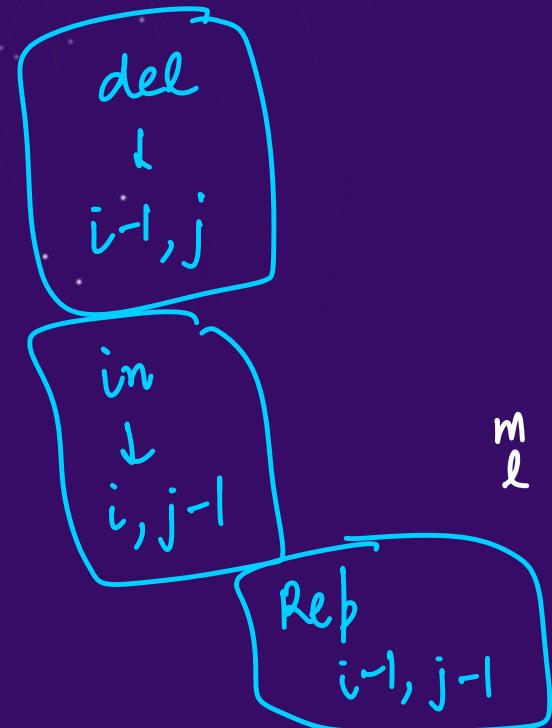
move
love

- 2) Replace 'm' with 'l'

love
love

Ques: (Recursive)

Q : Edit Distance (Algo)



[Leetcode 72]

Delete
Insert
Replace

Ques:

Q : Edit Distance

```
public int minDistance(String a, String b) {  
    int m = a.length(), n = b.length();  
    if(m==0 || n==0) return Math.max(m,n);  
    int[][] dp = new int[m][n];  
    for(int i=0;i<m;i++){  
        for(int j=0;j<n;j++){  
            int p = (i>=1 && j>=1) ? dp[i-1][j-1] : (i==0 ? j : i);  
            int q = (j>=1) ? dp[i][j-1] : i;  
            int r = (i>=1) ? dp[i-1][j] : j;  
            if(a.charAt(i)==b.charAt(j)) dp[i][j] = p;  
            else dp[i][j] = 1 + Math.min(r,Math.min(q,p));  
        }  
    }  
    return dp[m-1][n-1];  
}
```

Ques:

Q : Edit Distance

```
a = ""
```

```
b = "raghav"
```

Ques:

Q : Longest Common Subsequence (Tabulation)

We will understand tabulation in 2 ways:

- 1) Just convert memoization to tabulation
- 2) Thinking via tabulation.

to avoid the base case conversion step , you can make 'dp' larger

$\rightarrow m+1 \times n+1$

[Leetcode 1143]

Ques:

Q : Longest Common Subsequence (Tabulation)

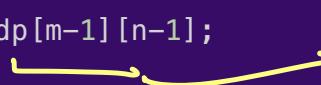
```

public int longestCommonSubsequence(String a, String b) {
    int m = a.length(), n = b.length();
    int[][] dp = new int[m][n]; // i = m-1 to 0 | j = n-1 to 0
    for(int i=0;i<m;i++){
        for(int j=0;j<n;j++){
            int p = (i>=1 && j>=1)? dp[i-1][j-1] : 0;
            int q = (j>=1)? dp[i][j-1] : 0;
            int r = (i>=1)? dp[i-1][j] : 0;
            if(a.charAt(i)==b.charAt(j)) dp[i][j] = 1 + p;
            else dp[i][j] = Math.max(q,r);
        }
    }
    return dp[m-1][n-1];
}

```

T.C. = $O(m * n)$

A.S. = $O(m * n)$

 Stores LCS of substr(a, 0, m-1) & substr(b, 0, n-1)

- $dp[i][j]$ will store the LCS of substring of 'a' from 0 to i & substring of 'b' from 0 to j .

[Leetcode 1143]

Ques:

Q : Longest Common Subsequence (Tabulation)

```

public int longestCommonSubsequence(String a, String b) {
    int m = a.length(), n = b.length();
    int[][] dp = new int[m+1][n+1];
    for(int i=1;i<=m;i++){
        for(int j=1;j<=n;j++){
            if(a.charAt(i-1)==b.charAt(j-1))
                dp[i][j] = 1 + dp[i-1][j-1];
            else
                dp[i][j] = Math.max(dp[i][j-1],dp[i-1][j]);
        }
    }
    return dp[m][n];
    // dp[i][j] will store LCS of substr(a,0,i-1) & substr(b,0,j-1)
}

```

Extra Row
2
Extra Col

$$T.C = O(m^*n)$$

$$A.S = O(m^*n) \longrightarrow O(n) \text{ [Space Optimization]} \quad [\text{Leetcode 1143}]$$

Ques:

Q : Longest Common Subsequence (Tabulation)

[Leetcode 1143]

Ques:

 $s_1 = b \ a \ c \ d \ e \ f$
 $s_2 = a \ g \ h \ c \ i \ f$

Q : Longest Common Subsequence (Tabulation)

dp

	a	g	h	c	i	f
b	0	0	0	0	0	0
a	1	1	1	1	1	1
c	1	1	1	2	2	2
d	1	1	1	2	2	2
e	1	1	1	2	2	2
f	1	1	1	2	2	3

m x n

dp[i][j]

LCS {
 $s_1 \rightarrow 0 \text{ to } i$ substr
 $s_2 \rightarrow 0 \text{ to } j$ substr}

[Leetcode 1143]