

Dynamic Programming 1

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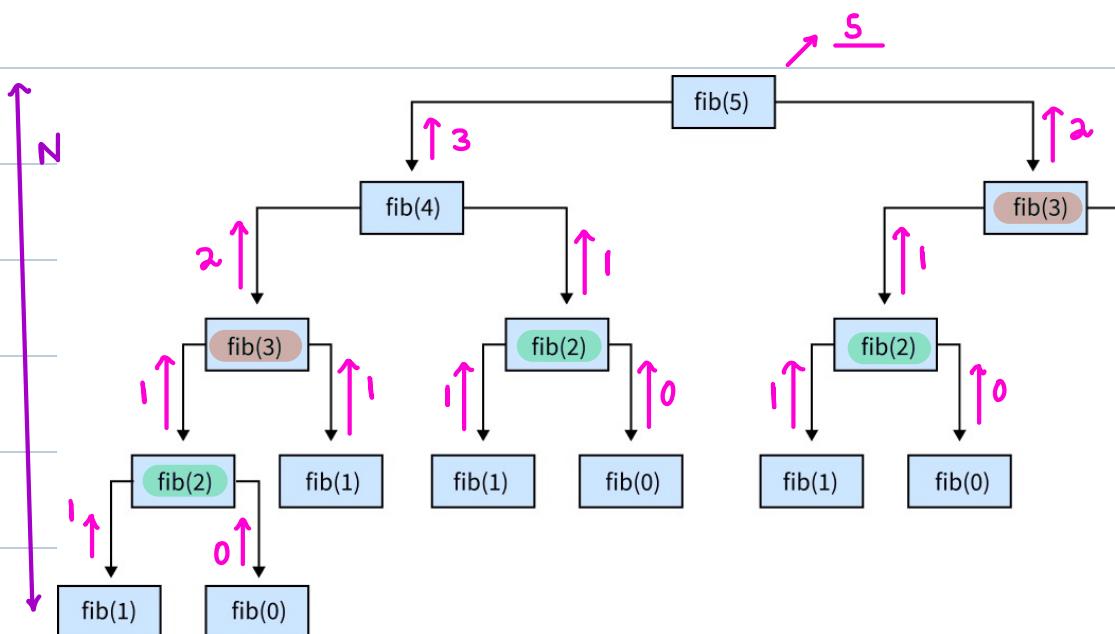
Nth Fibonacci Number



```
int fib (N) {  
    if (N <= 1) return N  
    return fib(N-1) + fib(N-2)  
}
```

$$TC = \underline{O(2^N)}$$

$$SC = \underline{O(N)}$$





1. Optimal Structure → A problem can be solved by dividing it into smaller subproblems.

2. Overlapping Subproblems → Some subproblems are calculated multiple times.

store & reuse → Dynamic Programming

// $\forall i, F[i] = -1$

```
int fib (N) {  
    if (N <= 1) return N  
    if (F[N] != -1) return F[N]  
    F[N] = fib(N-1) + fib(N-2)  
    return F[N]  
}
```

$$TC = O(N) \quad SC = O(N + N) = O(N)$$

$2^N \rightarrow N$ (using DP)





↑

Top - down Approach → Memoization in **recursive** solutions.

start with big problem, break it to smaller subproblems & recursively calculate answer.

Easy to understand & implement.



Bottom - up Approach → **Iterative** approach.

Start with base case & iteratively calculate ans for bigger problem.

→ No recursion space \Rightarrow potential to optimize sc in some cases.

$$F[0] = 0 \quad F[1] = 1$$

for $i \rightarrow 2$ to N {

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

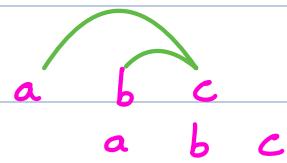
{

return $F[N]$

$$TC = \underline{O(N)}$$

$$SC = \underline{O(N)}$$

Further S.C Optimisation



$$a = 0 \quad b = 1$$

for $i \rightarrow 2$ to N {

$$c = a + b$$

$$a = b$$

$$b = c$$

}

$$TC = \underline{O(N)}$$

$$SC = \underline{O(1)}$$

return c

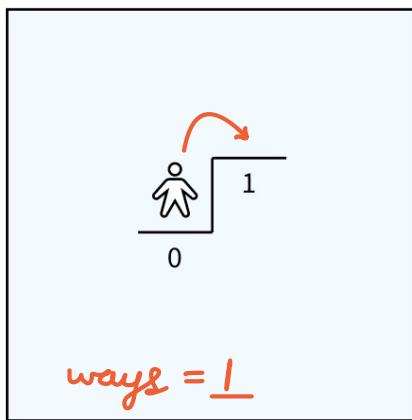
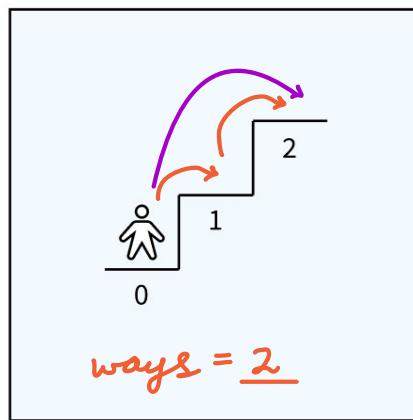
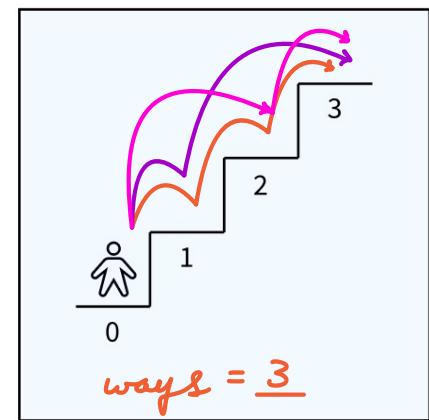
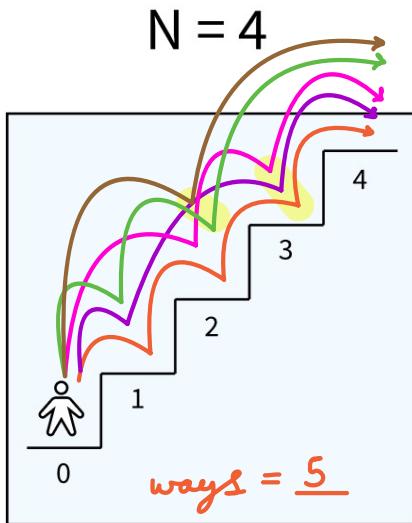


Climbing Stairs

 $1 \leq N \leq 10^5$

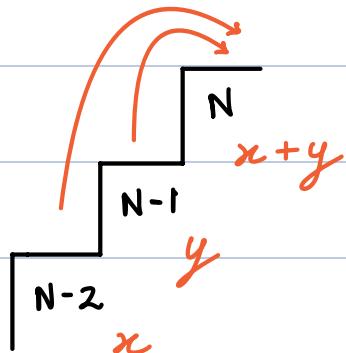
Calculate the number of ways to reach N th stair.

You can take 1 step at a time or 2 steps at a time.

 $N = 1$  $N = 2$  $N = 3$  $N = 4$ 

ways (0) = 1

way to do a task = 0
⇒ impossible



$$\text{ways}(N) = \text{ways}(N-1) + \text{ways}(N-2)$$

$$\text{ways}(0) = \text{ways}(1) = 1$$

code \rightarrow same as fibonacci number.



< Question > : Find the minimum number of perfect squares required to get sum = N?

[numbers can repeat]

$$N = 6 \quad 1^2 + 1^2 + 1^2 + 1^2 + 1^2 + 1^2$$

$$2^2 + 1^2 + 1^2 \quad \text{Ans} = \underline{3}$$

$$N = 10 \quad 1^2 + 1^2 + \dots, 10 \text{ times}$$

$$2^2 + 1^2 + 1^2 + \dots, 6 \text{ times}$$

$$2^2 + 2^2 + 1^2 + 1^2 \\ 3^2 + 1^2 \quad \text{Ans} = \underline{2}$$

$$N = 9 \quad 3^2 \quad \text{Ans} = \underline{1}$$

$$N = 5 \quad 2^2 + 1^2 \quad \text{Ans} = \underline{2}$$

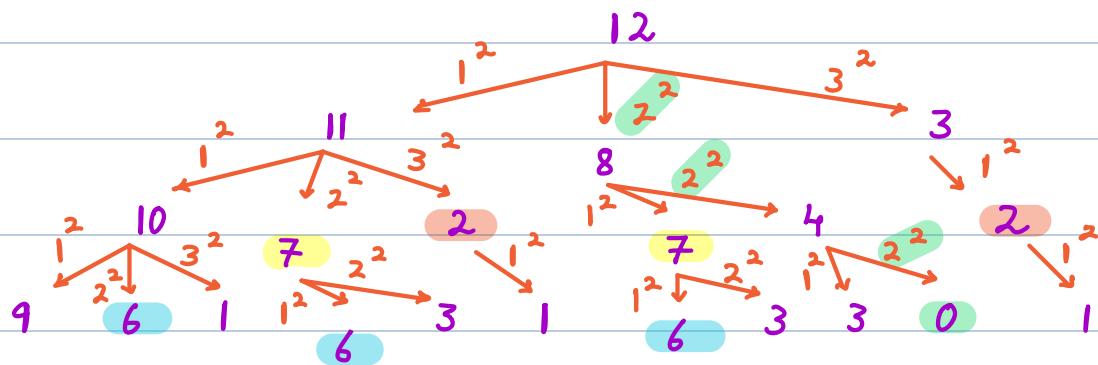
→ Use large perfect sq. to reduce count. (greedy)

X

$$N = 50 \quad 7^2 + 1^2 \quad \text{Ans} = \underline{2}$$

$$N = 12 \quad 3^2 + 1^2 + 1^2 + 1^2 \quad X$$

$$2^2 + 2^2 + 2^2 \quad \text{Ans} = \underline{3}$$



optimal substructure ✓ } use DP
 overlapping subproblems ✓

$$\text{crt}(12) = \min(\text{crt}(12 - 1^2), \text{crt}(12 - 2^2), \text{crt}(12 - 3^2)) + 1$$

$$\text{crt}(N) = \forall x \min(\text{crt}(N - x^2)) + 1$$

$$1 \leq x^2 \leq N$$

$$\forall i, \text{crt}[i] = i \quad // 1^2 + 1^2 + \dots i \text{ times} \quad (\text{crt}[0] = 0)$$

for $i \rightarrow 1$ to N {

for $x \rightarrow 1$ to \sqrt{i} { $// 1 \leq x^2 \leq i \quad x \rightarrow 1, 2$

$\text{crt}[i] = \min(\text{crt}[i], \text{crt}[i - x^2] + 1)$

}

}

return $\text{crt}[N]$

$$TC = \underline{\mathcal{O}(N\sqrt{N})}$$

$$SC = \underline{\mathcal{O}(N)}$$

$$N = 5$$

0	1	2	3	4	5
0	1	2	3	4 ₁	5 ₂

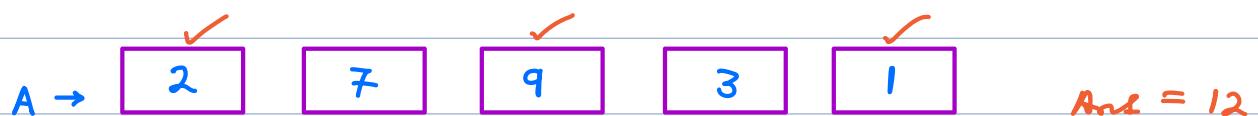
DP 2: Two Dimensional

Q → Give an integer array.

$A[i]$ → Money

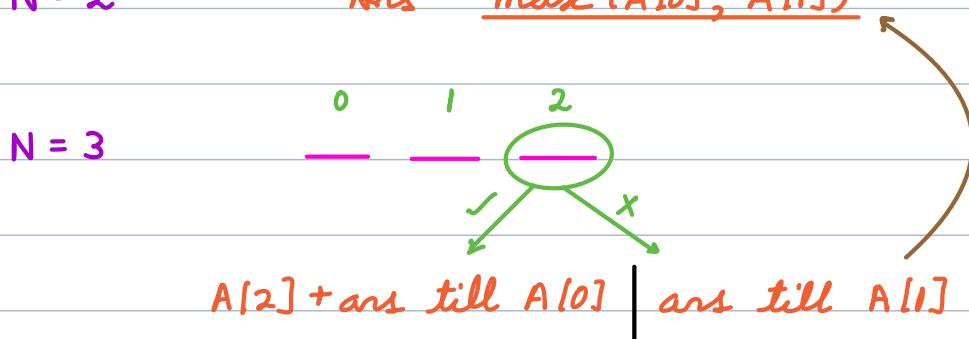
Find max sum without selecting adjacent elements.

$i-1 \leftarrow i \rightarrow i+1$



$N = 1$ Ans = $A[0]$

$N = 2$ Ans = $\max(A[0], A[1])$



$$\text{sum}[N] = \max \begin{cases} A[N] + \text{sum}[N-2] \\ \text{sum}[N-1] \end{cases}$$

$$\text{sum}[0] = A[0]$$

$$\text{sum}[1] = \max(A[0], A[1])$$

for $i \rightarrow 2$ to $(N-1)$ {

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

}

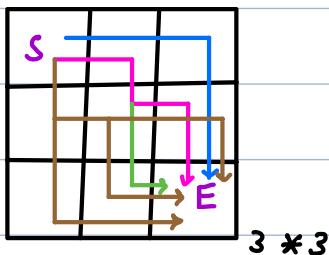
return $\text{sum}[N-1]$



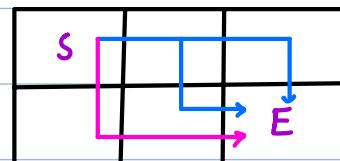
$$TC = O(N)$$

$$SC = O(1)$$

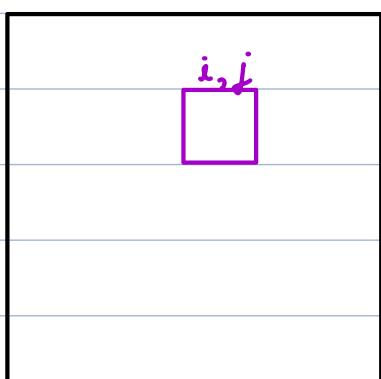
Q → Find #ways to travel from $(0,0)$ to $(N-1, M-1)$
s.t in one step we can go \rightarrow or \downarrow .



$$\text{Ans} = 6$$



$$\text{Ans} = 3$$

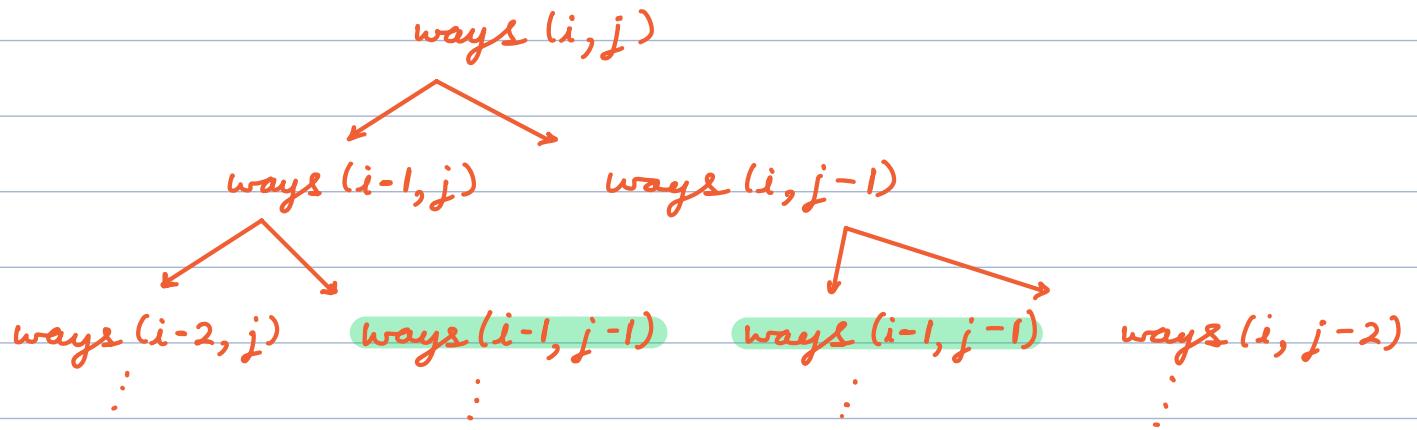
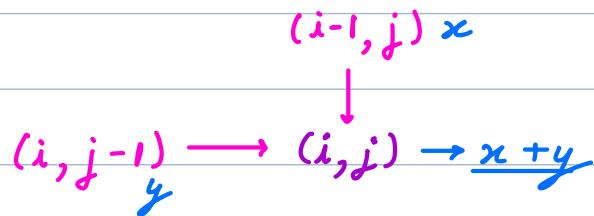


Start $\rightarrow (i, j) \rightarrow$ end

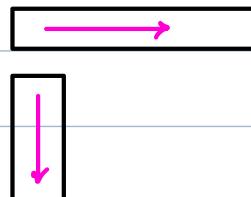
$\forall i, j$ find #ways from start to i, j
 $\Rightarrow \text{Ans} = (i, j) \rightarrow \text{End}$ ✓

$\forall i, j$ find #ways from i, j to end
 $\Rightarrow \text{Ans} = (i, j) \rightarrow \text{start}$ (H.W)

start →



$$\begin{aligned} \text{ways}(0, 0) &= 1 \\ \text{ways}(0, j) &= 1 \\ \text{ways}(i, 0) &= 1 \end{aligned}$$



optimal substructure ✓
overlapping subproblems ✓
use DP.

Bottom - Up

```
for i → 0 to (N-1) {  
    for j → 0 to (M-1) {  
        if (i == 0 || j == 0) ways[i][j] = 1  
        else ways[i][j] = ways[i-1][j] + ways[i][j-1]  
    }  
}  
return ways[N-1][M-1]
```

TC = O(N * M)

SC = O(N * M)

count[i][j] \rightarrow count of i digit nos. with digit sum j.

count[1][j] $\begin{cases} 1 & \text{if } 1 \leq j \leq 9 \\ 0 & \text{else} \end{cases}$

```
for j → 1 to 9 {
    count[1][j] = 1
}
```

```
for i → 2 to N {
    for j → 0 to S {
        for d → 0 to 9 {
            if (d ≤ j) {

```

count[i][j] += count[i-1][j-d]

// count[i][j] = (count[i][j] + count[i-1][j-d]) % M



}

TC = O(N * S)

SC = O(N * S)

optimize SC \rightarrow H.W

i \ j	0	1	2	3
0	0	0	0	0
1	0	1	1	1
2	0	1	2	3
3	0	1	3	6

→ Ans

Catalan Numbers

The Catalan numbers form a sequence of natural numbers that have numerous applications in **combinatorial mathematics**. Each number in the sequence is a solution to a variety of counting problems. The N th Catalan number, denoted as C_n , can be used to determine:

- The number of correct combinations of N pairs of parentheses.
- The number of **distinct binary search trees** with N nodes, etc.



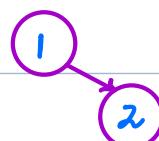
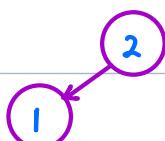
Q → Find the count of unique BST with N distinct nodes.

$N = 1$



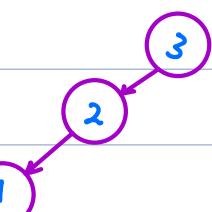
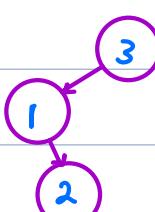
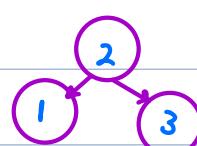
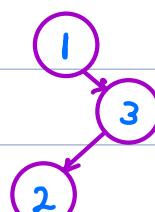
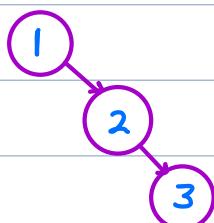
Ans = 1

$N = 2$



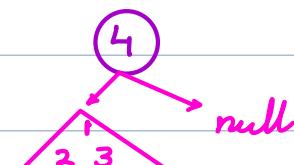
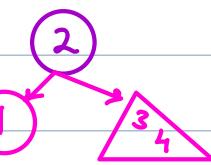
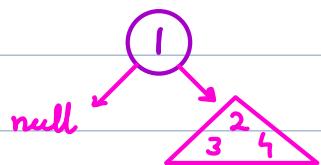
Ans = 2

$N = 3$



Ans = 5

$N = 4$



$$C(0) * C(3) + C(1) * C(2) + C(2) * C(1) + C(3) * C(0)$$

$$C(4) = 1 * 5 + 1 * 2 + 2 * 1 + 5 * 1 = \underline{14}$$

$$C(N) = \sum_{i=0}^{N-1} C(i) * C(N-1-i)$$

TC = $O(N^2)$

SC = $O(N)$

$$\frac{2^N C_N}{(N+1)}$$

$$c[0] = c[1] = 1$$

```
for i → 2 to N {  
    for j → 0 to (i-1) {  
        c[i] += c[j] * c[i-1-j]  
    }  
}  
return c[N]
```

DP 3 - KnapSack

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Notes

**ME REVIEWING THE 5
LINES OF CODE I WROTE AFTER
BROWSING THE INTERNET ALL DAY**



Q → Given an integer array & a target sum K.

Check if there exists a subset sum = K. ($A[i] > 0$)

may / may not be
continuous

$$A = [3, 4, 11, 5, 2] \quad K = 8$$

$$A[0] + A[3] = 8$$

$$A = [1, 2, 1, 3, 5] \quad K = 4$$

$$A[0] + A[1] + A[2] = 4$$

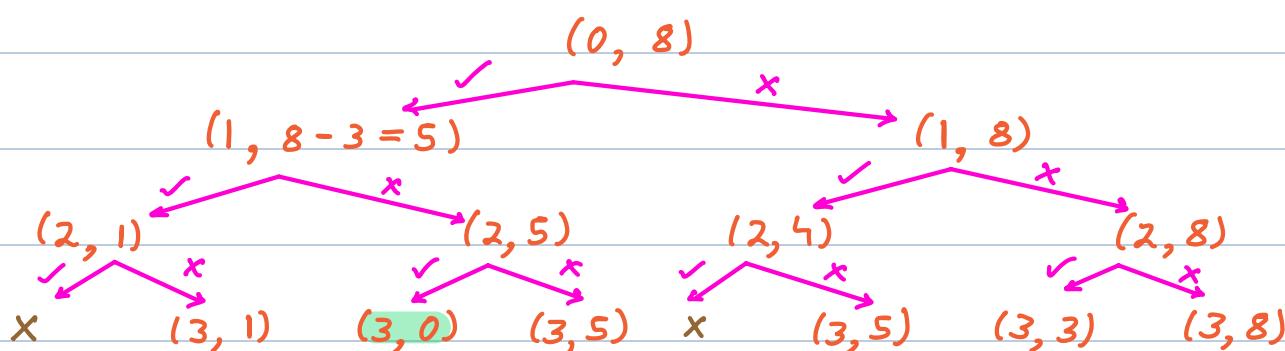
Bruteforce → Check sum for every subset.

$$TC = \underline{O(2^n)}$$

$\forall A[i]$
 \rightarrow select
 \rightarrow reject

$$A = [3, 4, 5, 2] \quad K = 8 \quad \text{Ans} = \underline{\text{true}}$$

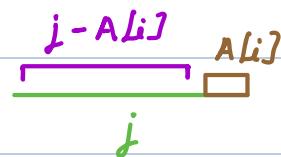
↑
(index, K)



optimal substructure }
 overlapping subproblems } use DP

$dp[i][j] \rightarrow$ check if subset sum = j considering elements from 0 to i .

$$dp[i][j] \xrightarrow{x} dp[i-1][j - A[i]] \text{ OR } dp[i-1][j]$$



$\forall i, dp[i][0] = \text{true}$ (empty subset)

for $i \rightarrow 0$ to $(N-1)$

$0 - (N-1), 0 - K$

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

if ($K \geq A[0]$) $dp[0][A[0]] = \text{true}$

for $i \rightarrow 1$ to $(N-1)$ {

for $j \rightarrow 1$ to K {

select

reject

if ($j \geq A[i]$) $dp[i][j] = \overbrace{dp[i-1][j - A[i]]}^{\text{select}} \text{ || } dp[i-1][j]$

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

}

} returns $dp[N-1][K]$

$TC = \underline{\underline{O(N \times K)}}$

$SC = \underline{\underline{O(N \times K)}}$

$O(2K) = \underline{\underline{O(K)}}$ ✓



KnapSack Problem

profit/loss

Given N objects with their values V_i and their weights W_i . *(cost)*

A bag with capacity W that can be used to carry some objects such that →

budget

total sum of objects weights $\leq W$, and

sum of values in the bag is maximised.

Fractional KnapSack

Given N cakes with happiness and weight.

Find max total happiness that can be kept in a bag with capacity = W

(cakes can be divided)



$N = 5$

happiness[] \rightarrow [3 8 10 2 5]

sum = 23

$W = 40$

weight[] \rightarrow [10 4 20 8 15]

$$20 - 4 = 16$$

$$40 - 20 = 20$$

$$16 - 15 = 1$$

→ use bag completely

→ How to select $\Rightarrow h[i]/w[i]$

 $N = 5$ $\text{happiness[]} \rightarrow [3 \ 8 \ 10 \ 2 \ 5]$ $W = 40$ $\text{weight[]} \rightarrow [10 \ 4 \ 20 \ 8 \ 15]$ $h/w \rightarrow 0.3 \ 2 \ 0.5 \ 0.25 \ 0.33$

parts \rightarrow 10 4 20 8 15
4 1 2 3

$$\text{Sum} = 2*4 + 0.5*20 + 0.33*15 + 0.3*1$$

$$= 8 + 10 + 5 + 0.3 = \underline{23.3} \text{ (Ans)}$$

Sol \rightarrow Select items in descending order

weight $h[i]/w[i]$ till complete capacity

is used. (greedy)

$$TC = \underline{O(N \log(N))} \quad SC = \underline{O(N)}$$

Practical Scenario

Flipkart is planning a special promotional event where they need to create an exclusive combo offer. The goal is to create combination of individual items that together offer the highest possible level of customer satisfaction (indicating its popularity and customer ratings) while ensuring the total cost of the item in the combo doesn't exceed a predefined.

0 - 1 KnapSack

Given N toys with their happiness and weight.

Find max total happiness that can be kept in a bag with capacity W.

[Toys can't be divided]

$N = 4$

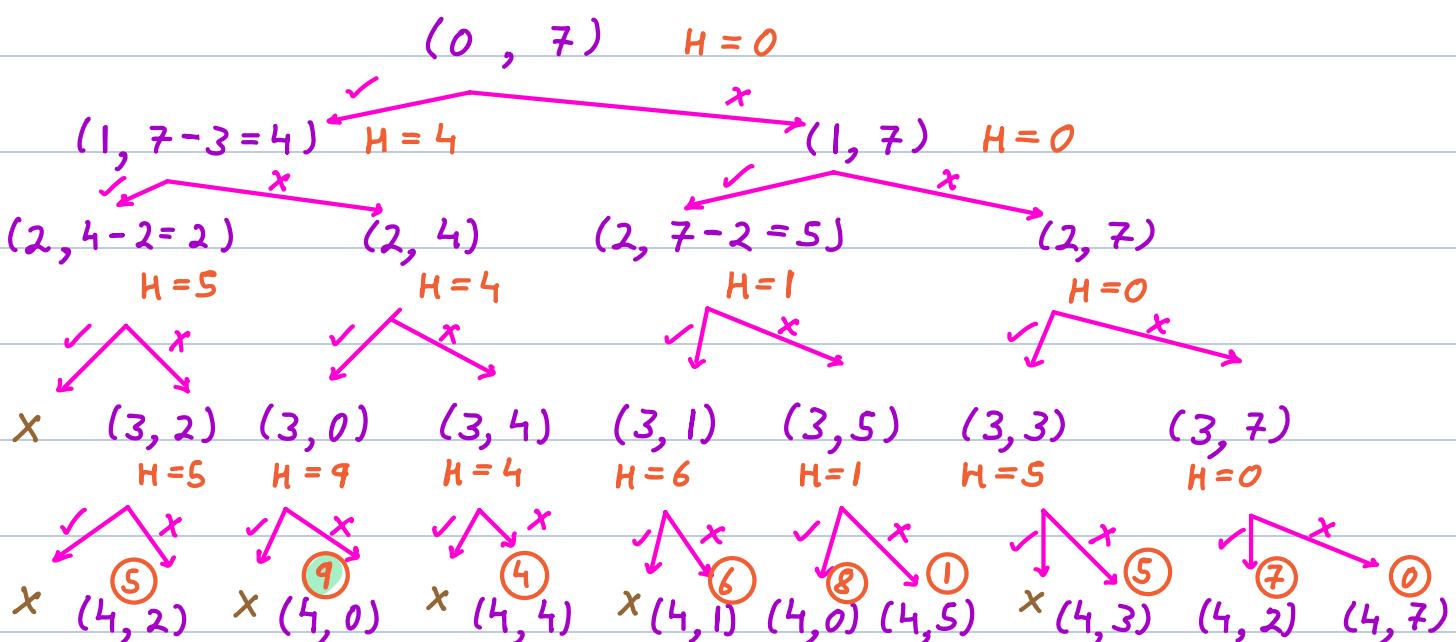
happiness[] \rightarrow [4 1 5 7]

$W = 7$

weight[] \rightarrow [3 2 4 5]

↑

(index, W)





$dp[i][j] \rightarrow$ max total happiness considering elements till index i & capacity j .

$$dp[i][j] \xrightarrow{x} h[i] + dp[i-1][j - w[i]]$$
$$dp[i-1][j]$$

$$\forall i, dp[i][0] = 0$$

(no capacity)

$$\forall j, dp[0][j] = 0$$

(nothing to buy)

// 1-based index

$$\forall i, dp[i][0] = 0$$

$$\forall j, dp[0][j] = 0$$

for $i \rightarrow 1$ to N {

for $j \rightarrow 1$ to W {

if ($j \geq w[i]$)

$$dp[i][j] = \max(h[i] + dp[i-1][j - w[i]], dp[i-1][j])$$

$$\text{else } dp[i][j] = dp[i-1][j]$$

}

}

$$TC = \underline{O(N \times W)}$$

$$SC = \underline{O(N \times W)}$$

$$O(2W) = \underline{O(W)}$$



Bottom - up

0 1 2 3 4

 $W = 8$

weight[] → [3 6 5 2 4]

 $N = 5$

		j								
		0	1	2	3	4	5	6	7	8
wt	h	0	0	0	0	0	0	0	0	0
3	12	✓1	0	0	0	12	12	12	12	12
6	20	2	0	0	0	12	12	12	20	20
5	15	✓3	0	0	0	12	12	15	20	27
2	6	4	0	0	0	12	12	15	20	27
4	10	5	0	0	6	12	12	18	20	21
			0	0	6	12	12	18	20	22
										27

(Ans)

Find the items selected.

$$i = N \quad j = W$$

if $(dp[i][j] == dp[i-1][j]) \rightarrow i^{\text{th}}$ item is rejected

$$i = i - 1$$

else $\rightarrow i^{\text{th}}$ item is selected

$$i = i - 1 \quad j = j - w[i]$$

Unbound KnapSack (0 - ∞ KnapSack)

Given N toys with their **happiness** and **weight**.

Find **max total happiness** that can be kept in a bag with **capacity W**.

[Toys can't be divided]

Items can be selected ∞ times.

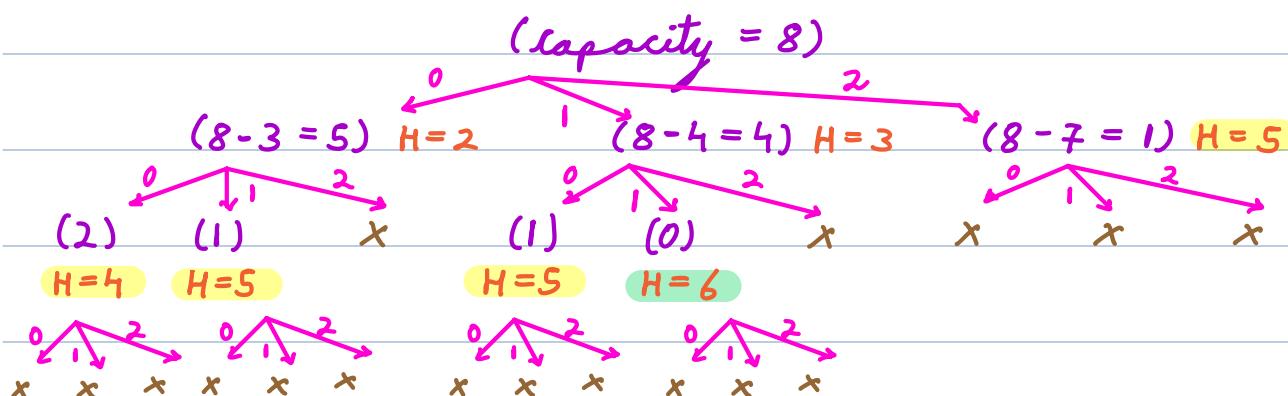
value[] \rightarrow [2 3 5] $W = 8, N = 3$
 weight[] \rightarrow [3 4 7]

2 times Ans = 6

val = [1 30] $W = 100$
 wt = [1 50] Ans = $1 * 100 = 100$

100 times

value[] \rightarrow [2 3 5] $W = 8, N = 3$
 weight[] \rightarrow [3 4 7]





$dp[i] \rightarrow$ Max happiness with capacity i .

$$dp[0] = 0$$

$$dp[i] = \max_{0 \leq j \leq N-1} (h[j] + dp[i - w[j]])$$

$$dp[0] = 0$$

for $i \rightarrow 1$ to w {

 for $j \rightarrow 0$ to $(N-1)$ {

 if ($i \geq w[j]$)

$$dp[i] = \max (dp[i], h[j] + dp[i - w[j]])$$

}

}

return $dp[w]$

$$TC = \underline{\mathcal{O}(N \times W)}$$

$$SC = \underline{\mathcal{O}(W)}$$

Knapsack \rightarrow Category.

Agenda :-

\rightarrow Rod cutting

\rightarrow coin change

\rightarrow 0-1 Knapsack - 2.

Agenda :- $\begin{matrix} \xrightarrow{\text{val}} \\ \xrightarrow{\text{not}} \end{matrix}$ $\text{cap} \square$

0-1 Knapsack

\hookrightarrow 1 item of 1 type

unbounded KP.

\rightarrow no limit
on no of items.

n items
not.
val
 \equiv] cap.

Ques Rod cutting problem

Given a rod of len n , and an array of len n , $A[i] \rightarrow$ price of i len rod, find maxm val we can obtain by selling the rod.

$$n = 5, \\ A = [0, 1, 4, 2, 5, 6]$$



$$2 + 3 \rightarrow 6$$

$$4 + 1 \rightarrow 6$$

$$2 + 2 + 1 \rightarrow 9$$

$$9 + 1 + 1 \rightarrow 4$$

$$1 + 1 + 1 + 1 + 1 \rightarrow 5$$

$$5 \rightarrow 6$$

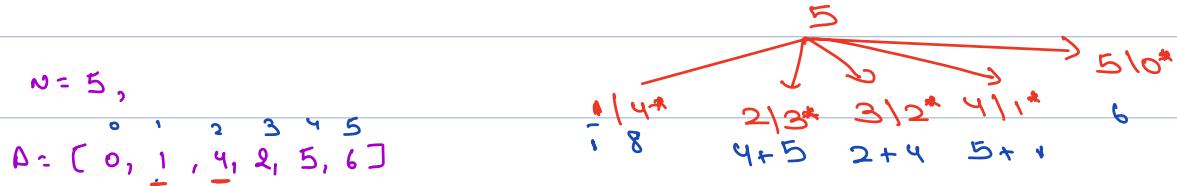
Capacity \rightarrow len of rod

not \rightarrow diff. lengths.

price \rightarrow —

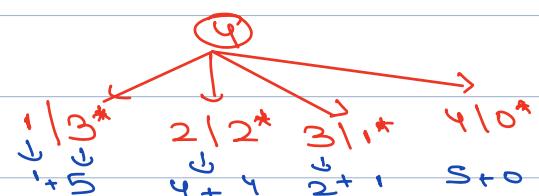
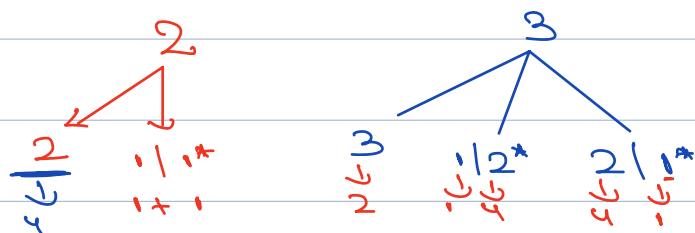
unbounded knapsack.

$dp[i] \rightarrow$ max profit we can get by selling
a rod of len i.



$dp \Rightarrow$

0	1	2	3	4	5	6
-	1	2	1.2	2.2	1.2.2	



$\forall i \quad dp[i] = 0$,

$T.C \rightarrow O(n^2)$

for $i \rightarrow 1 \text{ to } N$

$S.C \rightarrow O(n)$

for $j \rightarrow 1 \text{ to } i$

$dp[i] = \max(dp[i], \underline{A[j]} + dp[i-j]);$

$\underline{arr[1]+dp[3]}$
 $\underline{arr[2]+dp[2]}$

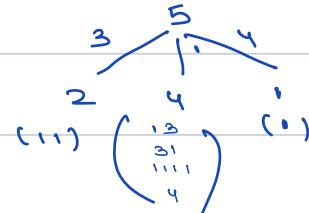
Duey (ain change Permutation $(x, y) \neq (y, x)$)

$$k=5$$

$$\$1,43 \quad \$4,13 \quad \$1,1,1,1,1$$

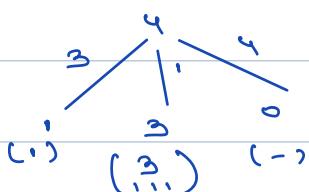
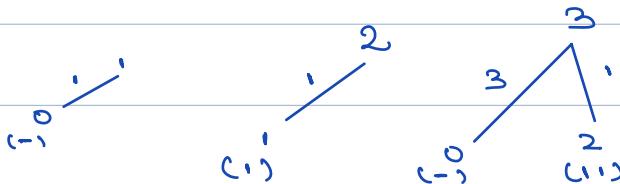
$$\text{Ans} = 6$$

$$A = \begin{bmatrix} 3 & 1 & 4 \\ 1 & 2 & 3 \\ 4 & 3 & 1 \end{bmatrix}$$

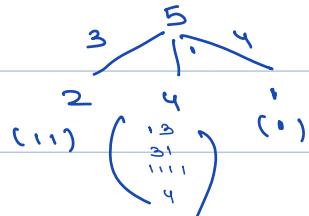


dp[i] \rightarrow no. of permutations to pay i rupees.

0	1	2	3	4	5
1	1	1	2	4	6
-	1	11	3 111	13 31 1111 4	113 121 311 11111 41 14



$$A = \begin{bmatrix} 3 & 1 & 4 \\ 1 & 2 & 3 \\ 4 & 3 & 1 \end{bmatrix}$$



int [] dp = new int [k+1];

dp[0]=1;

$i \geq s$

for (i=1; i<=k; i++) {

$\rightarrow \text{array}, \text{ } j=0$ Blanks

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

$i[j] - arr[j] \geq 0$ }
}, $dp[i] = dp[i - arr[j]]$

3

3

T.C $\rightarrow O(N \cdot k)$

S.C $\rightarrow O(k)$

Break

7:59 AM - 8:09 AM

Due

Due Coin change Combination $(m, y) = (y, m)$

$k = 5$

$\text{Ans} = 3$

$A = [3, 1, 4]$

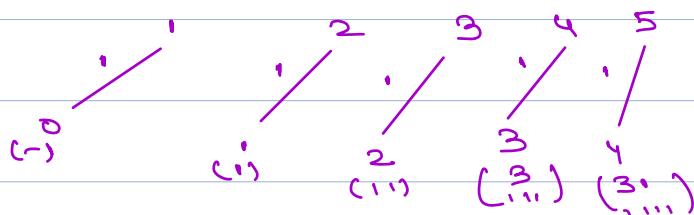
$\{1, 4, 3\}$ $\{4, 1, 3\}$ $\{1, 1, 1, 1, 1, 3\}$

$\{1, 1, 3, 3\}$, $\{3, 1, 1, 3\}$, $\{1, 3, 1, 3\}$

5
4
1
(1)

$\text{dp}[i] \rightarrow$ no. of Combinations to pay i rupees.

0	1	2	3	4	5
1	1	1	$\times 2$	$\times 3$	$\times 3$
-	1	11	3 111	31 1111 4	311 11111 14



int [] dp = new int [k+1];

dp[0]=1;

for (i=1; i<=k; i++) { ↑ order of these two.

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

if (i - arr[j] >= 0) {

dp[i-j] = dp[i-arr[j]]

3

3

T.C $\rightarrow O(N \cdot k)$

S.C $\rightarrow O(k)$

Ques 0-1 knapsack

Given n items, with a wt & val. find max val which can be obtained by picking items s.t., total weight of all items $\leq \text{cap}$.

Note 1 :- Every item can be picked only 1 time.

Note 2 :- We can pick partially.

T.C
↓

$$1 \leq n \leq 500$$

$$O(m \times \text{cap})$$

$$1 \leq \text{val}[i] \leq 50$$

$$1 \leq \text{wt}[i] \leq 10^9$$

$$1 \leq \text{cap} \leq 10^9$$

$$S \approx 10^{11}$$

$dp[i][j] \rightarrow$ Max profit we can get in a

bag of cap j if we choose

0-1 items.

$dp[0][0]$

$$1 \leq n \leq 500$$

$$1 \leq val[i] \leq 50$$

$$1 \leq w[i] \leq 10^9$$

$$1 \leq cap \leq 10^9$$

min Profit

$$500 \times 50 \Rightarrow 25 \times 10^3$$

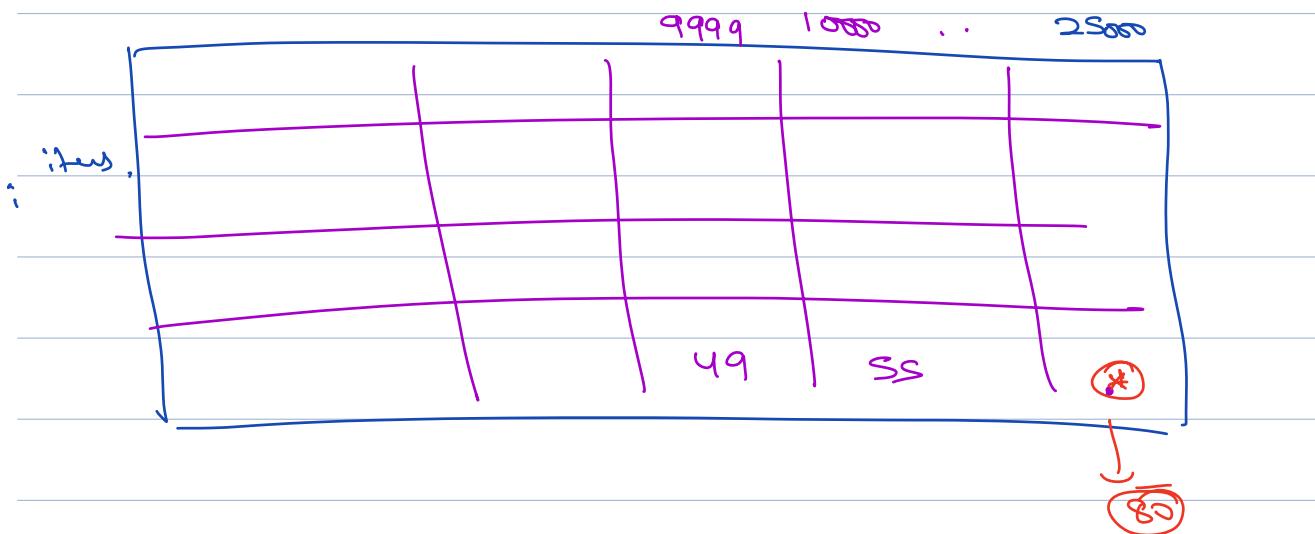
$$\Rightarrow 25000.$$

$$cap = 50.$$

dp[i][j] \rightarrow min wt. req. to get j profit

if we choose first i item.

$j \rightarrow$ Profit.



wt	10, 20, 30
val	1000 500 500

dp[i][j] \rightarrow min wt. req. to get j profit

if we choose first i item.

$j \rightarrow$ Profit.

$wt[i] \rightarrow 4 \ 1 \ 5 \ 4 \ 3 \ 7 \ 4$

$val[i] \rightarrow 2 \ 1 \ 2 \ 1 \ 2 \ 1 \ 2$

Profit

$cap = 6$

var	wt	0	1	2	3	4	5
-	-	0	∞	0	0	∞	∞
2	4	0	∞	4	4	0	∞
1	1	0	1	4	5	0	0
2	5	0	1	4	5	9	10

```
private int knapsack_Unbounded_Memo(int cap, int[] val, int[] wts, int n, int[] dp) {
    if (dp[cap] != -1)
        return dp[cap];
    // Base case:
    if (cap == 0 || n == 0)
        return 0;

    return dp[cap] = Math.max(
        val[n - 1] + knapsack_Unbounded_Memo(cap - wts[n - 1], val, wts, n, dp),
        knapsack_Unbounded_Memo(cap, val, wts, n - 1, dp)
    );
}
```