

Dynamic Programming

→ Lecture - 8 9 AM to 12 PM Saturday
30 April

① Paint fence

② Ugly No - II

③ Ugly No - III

④ Egg Jump

⑤ Jump Game - All Paths

Paint fence

(n houses, k colors)

no more than 2 houses
have the same color

$$\# \overbrace{N=1}^{=} \quad k=1 \quad \boxed{\text{RRR}} \quad ①$$

$$\# \overbrace{N=2}^{=} \quad k=1 \quad \boxed{\text{RR}} \quad ①$$

$$k=2 \quad \boxed{\text{RR}}, \quad \boxed{\text{RR}} \quad ②$$

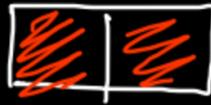
$$k=2 \quad \boxed{\text{RR}}, \quad \boxed{\text{RR}} \quad ③$$

$$k=3 \quad \boxed{\text{RR}}, \quad \boxed{\text{RR}}, \quad \boxed{\text{RR}} \quad ④$$

$$\vdots \downarrow \quad k \rightarrow \boxed{k}$$

$$\boxed{\text{RR}} \quad \boxed{\text{RR}} \quad \boxed{\text{RR}} \quad \boxed{\text{RR}} \quad \boxed{\text{RR}}$$

$N=2$
 $k=3$



⑨



$N=2$
 k

\mathbb{R}^2

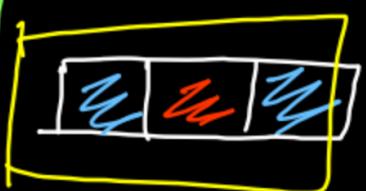
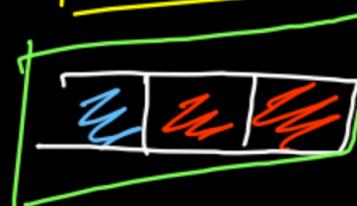
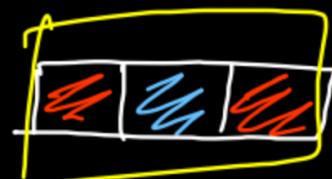
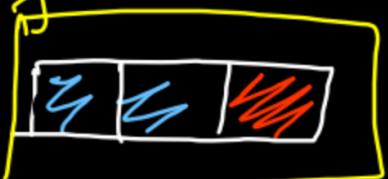
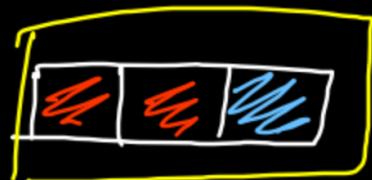
$N=3$

$k=1$



$k=2$ ⑥

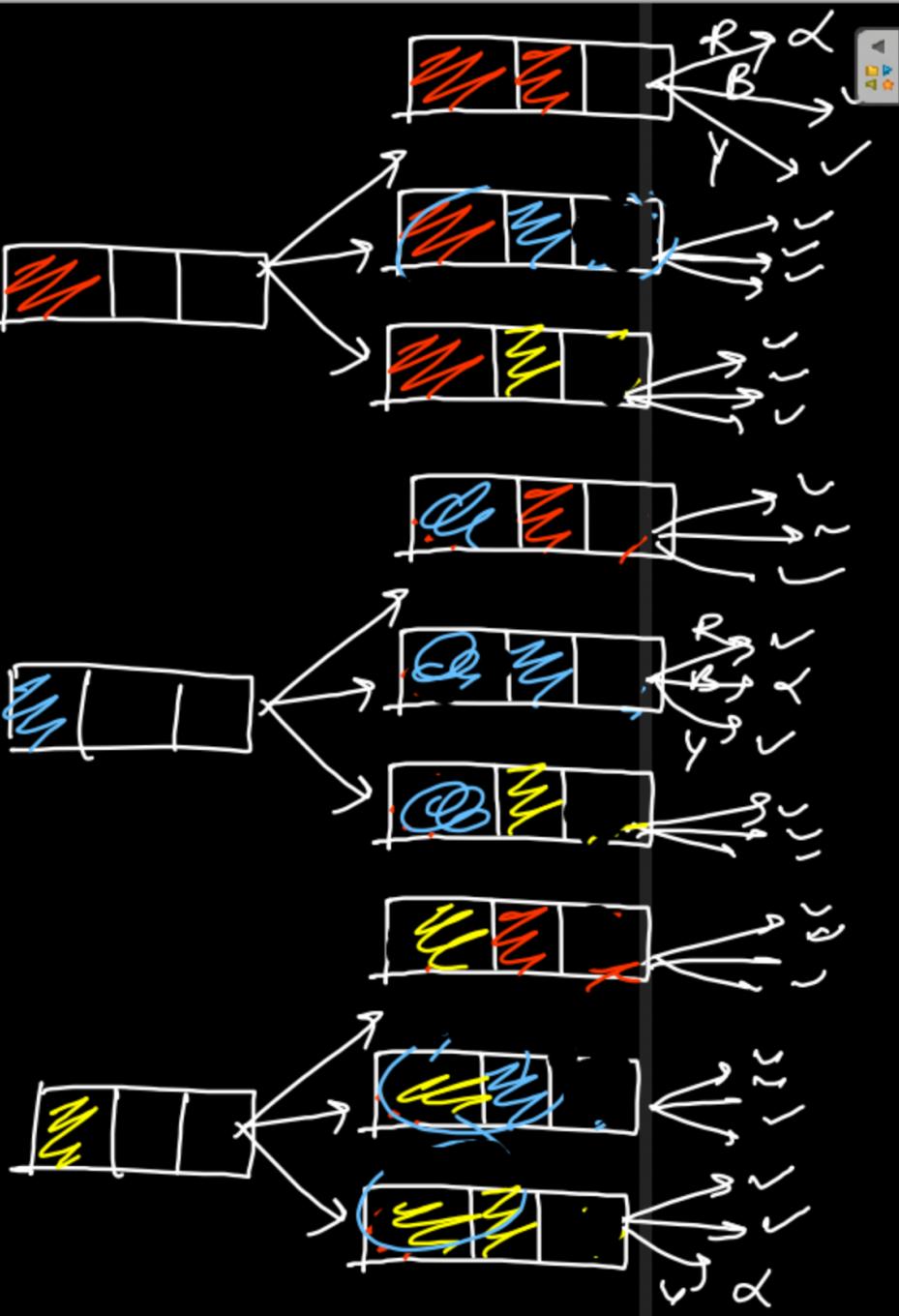
$fd(n, k)$



$k=3$

24

$fs(n, k)$

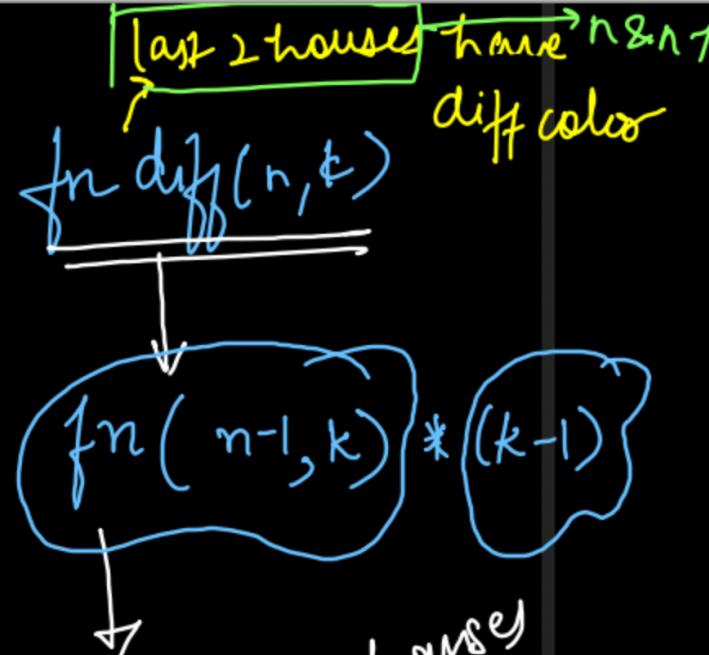


$$f_n(n, k) = f_{\text{nsame}}(n, k) + f_{\text{ndiff}}(n, k)$$

$f_{\text{nsame}}(n, k)$

$f_{\text{ndiff}}(n, k)$

↓



$$f(n, k) = \left[f(n-2, k) + f(n-1, k) \right] * (k-1)$$

⇒ we are painting
 n^{th} house with
any color other
than $(n-1)^{\text{th}}$ house

Tabulation

(last 2 houses)
Same

	$N=1$	$N=2$	$N=3$	$N=4$
Same		3	3×2	18
diff		3×2	$(3 + 3 \times 2) \times 2 = 18$	$(18 + 6) \times 2 = 48$



$k=3$

~~TC $\Rightarrow O(n)$~~
~~SC $\Rightarrow O(n)$~~ \rightarrow space can be optimized

```
public class Solution {  
    public int memo(int n, int k, int[] dp){  
        if(n == 1) return k;  
        if(n == 2) return k * k;  
        if(dp[n] != -1) return dp[n];  
  
        int ans = (memo(n - 1, k, dp) + memo(n - 2, k, dp)) * (k - 1);  
        return dp[n] = ans;  
    }  
  
    public int numWays(int n, int k) {  
        if(n == 1) return k;  
        if(n == 2) return k * k;  
        if(k == 1) return 0;  
  
        int[] dp = new int[n + 1];  
        Arrays.fill(dp, -1);  
        return memo(n, k, dp);  
    }  
}
```



0.7 x

```
public int numWays(int n, int k) {  
    if(n == 1) return k;  
    if(n == 2) return k * k;  
    if(k == 1) return 0;  
  
    int[] same = new int[n + 1];  
    int[] diff = new int[n + 1];  
    same[2] = k; diff[2] = k * (k - 1);  
  
    for(int i=3; i<=n; i++){  
        same[i] = diff[i - 1];  
        diff[i] = (same[i - 1] + diff[i - 1]) * (k - 1);  
    }  
  
    return same[n] + diff[n];  
}
```



0.7 x

```
public int numWays(int n, int k) {  
    if(n == 1) return k;  
    if(n == 2) return k * k;  
    if(k == 1) return 0;  
  
    int same = k;  
    int diff = k * (k - 1);  
  
    for(int i=3; i<=n; i++){  
        int newSame = diff;  
        int newDiff = (same + diff) * (k - 1);  
  
        same = newSame; diff = newDiff;  
    }  
  
    return same + diff;  
}
```

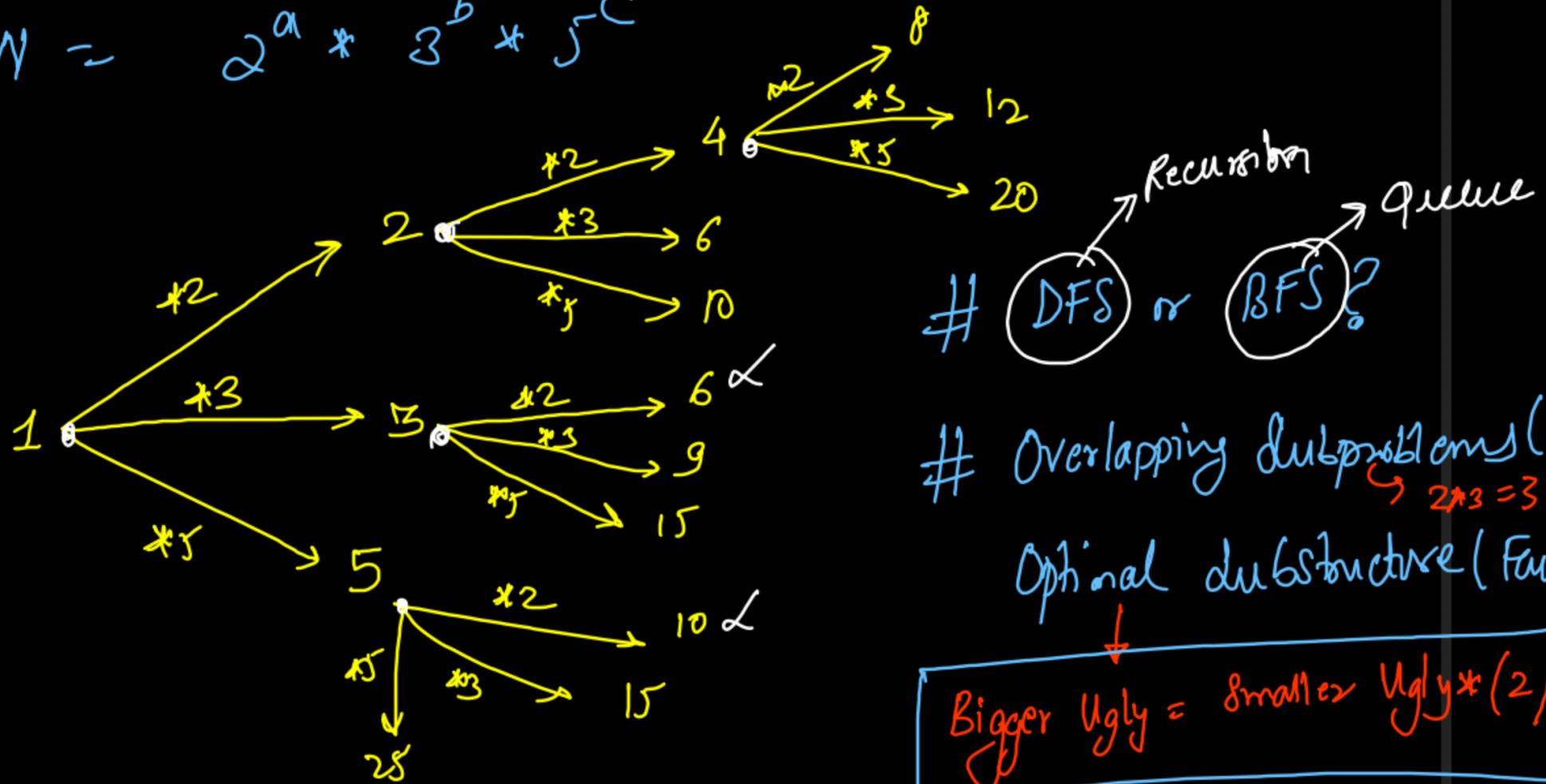


0.7 x

Mgly No - 11

$$\frac{1^{\circ}, 2, 3, 4, 5, 6, 8}{10}$$

$$N = 2^a * 3^b * 5^c$$



Overlapping subproblems (DP)

Optional substructure (Faith)

$$\text{Bigger Ugly} \leftarrow \frac{\text{smaller Ugly}}{(2/3/5)}$$

~~ptr 2~~
~~5th - 6th~~

4th
9th 3
4th 3

~~ptr 5~~
~~2nd 3rd~~
~~1st 5~~

①, ②, ③, ④, ⑤, ⑥, ⑦, ⑧, ⑨, ⑩
1st 2nd 3rd 4th 5th 6th 7th 8th 9th 10th

```
// O(N) Time, O(N) Space
public int nthUglyNumber(int n) {
    if(n == 1) return 1;

    // Pointers Pointing to Indices not Values
    int ptr2 = 0, ptr3 = 0, ptr5 = 0;

    ArrayList<Integer> ugly = new ArrayList<>(); // visited array
    ugly.add(1); // to add the 1st ugly no at index 0

    for(int i=1; i<n; i++){
        int a = ugly.get(ptr2) * 2;
        int b = ugly.get(ptr3) * 3;
        int c = ugly.get(ptr5) * 5;

        int min = Math.min(a, Math.min(b, c));
        ugly.add(min);

        if(min == a) ptr2++;
        if(min == b) ptr3++;
        if(min == c) ptr5++;
    }

    return ugly.get(n - 1);
}
```



0.7 x

```
// O(N * Log N) Time, O(N) Space
public int nthUglyNumber(int n) {
    if(n == 1) return 1;

    PriorityQueue<Long> q = new PriorityQueue<>();
    q.add(1L);
    HashSet<Long> vis = new HashSet<>();

    int idx = 0;
    while(q.size() > 0){
        long min = q.remove();
        if(vis.contains(min) == true)
            continue;

        idx++;
        if(idx == n) return (int)min;

        vis.add(min);
        q.add(min * 2L);
        q.add(min * 3L);
        q.add(min * 5L);
    }

    return 1;
}
```

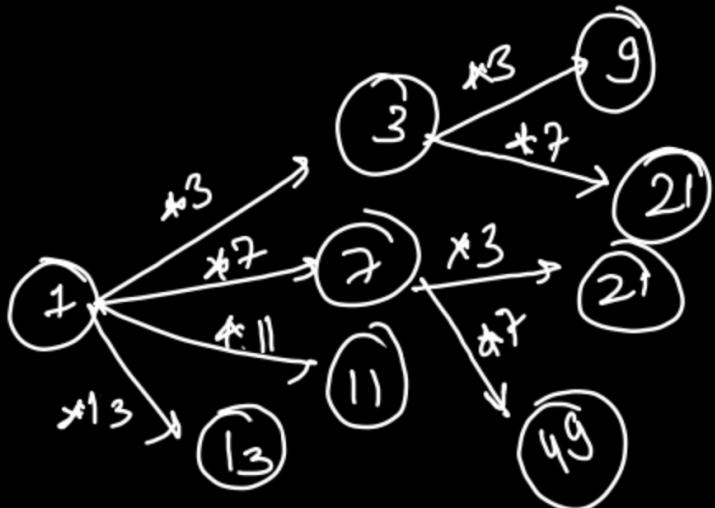


0.5 x

~~Super Ugly No~~

Q (Input) prime = { 3, 7, 11, 13 } Q ugly ?
 $N=7$

(Extra)
= O(F) prime = { 4, 3, 2, 2 }



RCS (Extra) = O(N)
1st, 2nd, 3rd, 4th, 5th, 6th, 7th

space
comp

O($Nl+k$)
l = $\log N$
k = pointers index

```
// O(N * K) Time, O(N + K) Space
public int nthSuperUglyNumber(int n, int[] primes) {
    int[] ptr = new int[primes.length];

    ArrayList<Integer> ugly = new ArrayList<>();
    ugly.add(1); // Add 1st Ugly No at Index 0

    for(int i=1; i<n; i++){
        // Finding the next Smallest Ugly No
        int min = Integer.MAX_VALUE;
        for(int j=0; j<primes.length; j++)
            min = Math.min(min, ugly.get(ptr[j]) * primes[j]);

        ugly.add(min);

        // Updating All Pointers Pointing to Min
        for(int j=0; j<primes.length; j++)
            if(ugly.get(ptr[j]) * primes[j] == min)
                ptr[j]++;
    }

    return ugly.get(n - 1);
}
```



0.5 x

Dynamic Programming - Lecture ⑨

9 AM - 12 PM

Sunday, 1 May

- Count of ways {
 - Coin Change Permutations
 - Coin Change Combinations
- minimum steps {
 - Minimum Coin change
 - Indian Coin change

#Coin Change → Minimum Coins (Indian)

eg:

{1, 2, 5, 10}

target = 79

$$\underbrace{(10 * 7)}_{\downarrow} + \underbrace{(5 * 1)}_{\downarrow} + \underbrace{(2 * 2)}_{\downarrow}$$

$$7 + 1 + 2 = 10 \text{ coins}$$

Why greedy is working?

uniformity coins
multiples of

eg:

{1, 2, 5, 10, 20, 50, 100, 500, 2000}

target = 2499

$$2000 * 1 + 100 * 4 + 50 * 1$$

$$+ 20 * 2 + 5 * 1 + 2 * 2$$

$$1 + 4 + 1 + 2 + 1 + 2 = 11 \text{ coins}$$

indian
denomination
↳ greedy will
also work



```
static List<Integer> minPartition(int target)
{
    List<Integer> res = new ArrayList<>();
    int[] coins = {1, 2, 5, 10, 20, 50, 100, 200, 500, 2000};
    int count = 0;

    for(int i=coins.length-1; i>=0; i--){
        while(target - coins[i] >= 0){
            res.add(coins[i]);
            target -= coins[i];
        }

        if(target == 0) break;
    }

    return res;
}
```

Time Comp

$$\hookrightarrow \frac{N}{2000} + \frac{N}{500} + \frac{N}{200} + \dots + \frac{N}{1}$$

$$\Rightarrow O(N + N + N + \dots + N) = O(N \times 10) \\ \approx O(N)$$

Space Complexity \rightarrow $O(1)$ extra space
 $O(n)$ output space

322. Coin Change → Minimum

$$\text{Coins} = \{2, 3, 7\} \quad \text{target} = 8$$

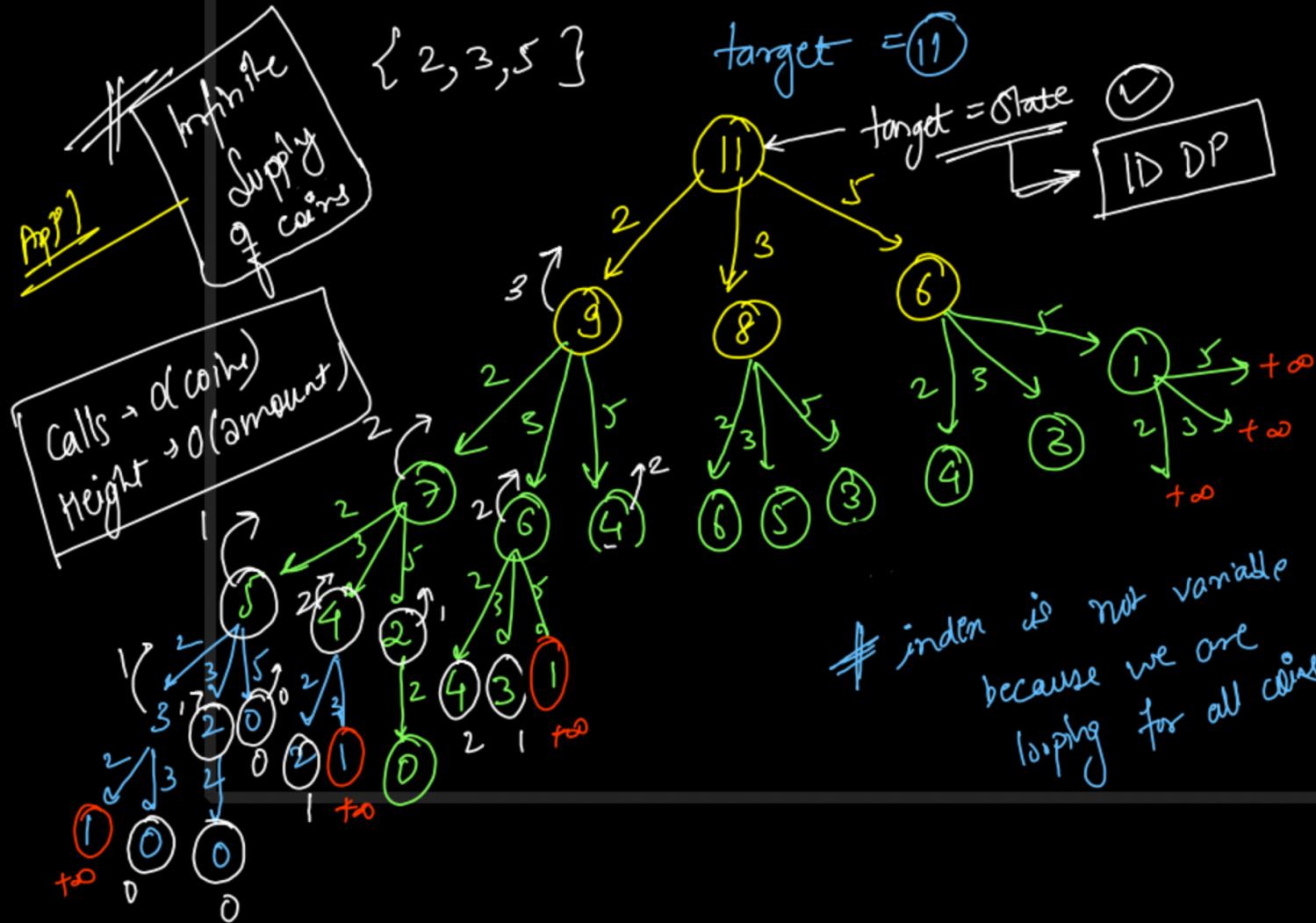
~~Greedy~~ target = $8 - 7 = 1$ } no answer possible
target

Actualized

$$\begin{aligned} \text{target} &= 8 - 3 = 5 \\ 5 - 3 &= 2 \\ 2 - 2 &= 0 \end{aligned}$$

} ans = 3

not the biggest coin
target



index is not variable
because we are
looping for all elements

```
// Time Complexity: O(Amount * Coins), Space Complexity: O(Amount)
public int memo(int amount, int[] coins, int[] dp){
    if(amount == 0) return 0;
    if(dp[amount] != -1) return dp[amount];

    int minCoins = Integer.MAX_VALUE;
    for(int i=0; i<coins.length; i++){
        if(amount - coins[i] >= 0){
            minCoins = Math.min(minCoins, memo(amount - coins[i], coins, dp));
        }
    }

    if(minCoins < Integer.MAX_VALUE) minCoins += 1;
    return dp[amount] = minCoins;
}

public int coinChange(int[] coins, int amount) {
    int[] dp = new int[amount + 1];
    Arrays.fill(dp, -1);

    int ans = memo(amount, coins, dp);
    return (ans == Integer.MAX_VALUE) ? -1 : ans;
}
```



0.5 x


```
// Time Complexity: O(Amount * Coins), Space Complexity: O(Amount * Coins)
public int memo(int amount, int idx, int[] coins, int[][] dp){
    if(amount == 0) return 0;
    if(idx == coins.length) return Integer.MAX_VALUE;
    if(dp[amount][idx] != -1) return dp[amount][idx];

    int minCoins = Integer.MAX_VALUE;
    for(int coin=0; amount >= coins[idx]*coin; coin++){
        int ans = memo(amount - coins[idx] * coin, idx + 1, coins, dp);
        if(ans < Integer.MAX_VALUE) ans += coin;
        minCoins = Math.min(minCoins, ans);
    }

    return dp[amount][idx] = minCoins;
}

public int coinChange(int[] coins, int amount) {
    int[][] dp = new int[amount + 1][coins.length];
    for(int i=0; i<=amount; i++){
        for(int j=0; j<coins.length; j++){
            dp[i][j] = -1;
        }
    }

    int ans = memo(amount, 0, coins, dp);
    if(ans == Integer.MAX_VALUE) return -1;
    return ans;
}
```



0.5 x

App(3)

{2, 3, 5}

target = 9

States → Amount
States → Index

Height → Demand
Calls → Demand



→ infinite supply

If I am taking yes call for a coin, next level, same coin will be present

If I am taking no call, in the next level, next coin will explore the choices



0.7x

```
// Time Complexity: O(Amount * Coins), Space Complexity: O(Amount * Coins)
public int memo(int amount, int idx, int[] coins, int[][] dp){
    if(amount < 0) return Integer.MAX_VALUE;
    if(amount == 0) return 0;
    if(idx == coins.length) return Integer.MAX_VALUE;
    if(dp[amount][idx] != -1) return dp[amount][idx];

    int yes = memo(amount - coins[idx], idx, coins, dp);
    if(yes != Integer.MAX_VALUE) yes += 1;

    int no = memo(amount, idx + 1, coins, dp);
    |
    return dp[amount][idx] = Math.min(yes, no);
}

public int coinChange(int[] coins, int amount) {
    int[][] dp = new int[amount + 1][coins.length];
    for(int i=0; i<=amount; i++){
        for(int j=0; j<coins.length; j++){
            dp[i][j] = -1;
        }
    }

    int ans = memo(amount, 0, coins, dp);
    if(ans == Integer.MAX_VALUE) return -1;
    return ans;
}
```



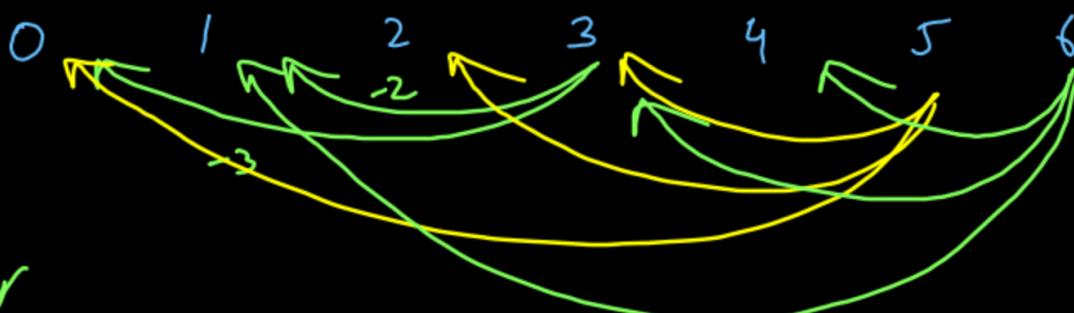
0.5 x

Tabulation

{ 2, 3, 5 }

target = 7

0	∞	i	1	2	1	2	2
0	1	2	3	4	5	6	7



1D array
d amount
(is a must)
space opt
↓
Not possible

smaller

problem

larger

problem

$dp[i] = \min$ using to form
target i

```
// Time -> O(Amount * Coin), Space -> O(Amount)
public int coinChange(int[] coins, int amount) {
    int[] dp = new int[amount + 1];
    Arrays.fill(dp, Integer.MAX_VALUE);
    dp[0] = 0;

    for(int i=1; i<=amount; i++){
        for(int coin: coins){
            if(i - coin >= 0 && dp[i - coin] != Integer.MAX_VALUE)
                dp[i] = Math.min(dp[i], dp[i - coin] + 1);
        }
    }

    return (dp[amount] == Integer.MAX_VALUE) ? -1 : dp[amount];
}
```



0.7 x

Coin change Permutation vs Combinations

coins = {2, 3, 5}

target = ⑩

Permutations

⑭

{2, 2, 2, 2, 2} {5, 5}

{2, 2, 3, 3} {2, 3, 3} {2, 3, 3, 2}

{3, 2, 2, 3} {3, 2, 3, 2} {3, 3, 2, 2}

{2, 2, 3, 5} {2, 2, 5, 3} {3, 2, 5}
{3, 5, 2} {5, 2, 3} {5, 3, 2}

⑮

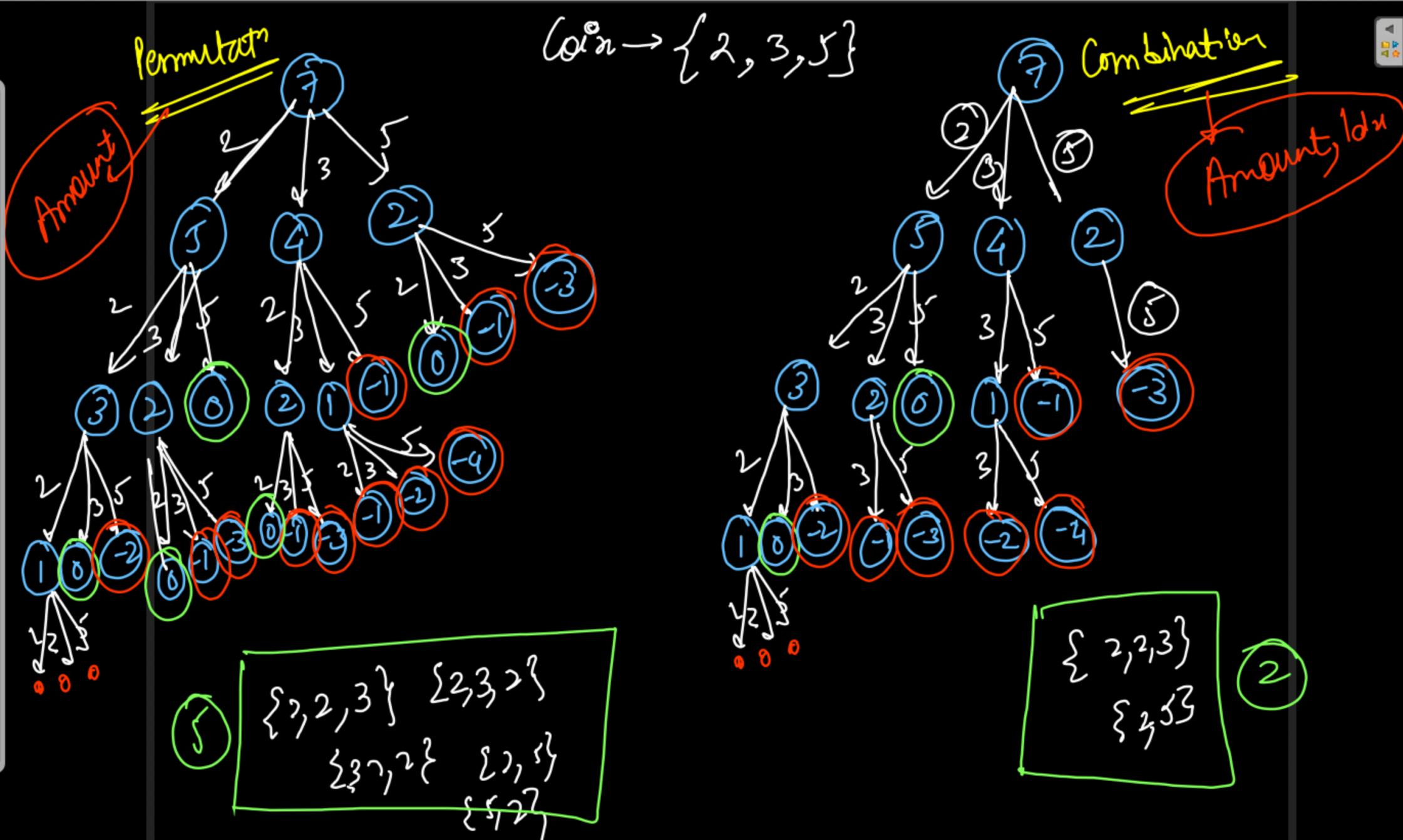
Combinations

{2, 2, 2, 2, 2} {2, 2, 3, 3}

{5, 5} {2, 3, 5}

3! = 6

$$\frac{10!}{2! 2!} = 6$$



Dynamic Programming lecture ⑩

3 May 2022,
8 PM - 11 PM

Coin change

→ Permutations (377)

→ Combinations (518)

+

Knapsack Variations

→ 0/1 Knapsack

→ Unbounded Knapsack

{ QFG }

Permutation

```
class Solution {
    public int memo(int amount, int[] coins, int[] dp) {
        if (amount < 0) return 0;
        if (amount == 0) return 1;
        if (dp[amount] != -1) return dp[amount];

        int perm = 0;
        for (int i = 0; i < coins.length; i++) {
            perm += memo(amount - coins[i], coins, dp);
        }

        return dp[amount] = perm;
    }

    public int combinationSum4(int[] coins, int amount) {
        int[] dp = new int[amount + 1];
        Arrays.fill(dp, -1);

        return memo(amount, coins, dp);
    }
}
```

Combination

```
// Time - O(Amount * Coins), Space - O(Amount * Coins): 2D DP + RCS
public int memo(int amount, int lastCoin, int[] coins, int[][] dp) {
    if (amount < 0) return 0;
    if (amount == 0) return 1;
    if (dp[amount][lastCoin] != -1) return dp[amount][lastCoin];

    int perm = 0;
    for (int coin = lastCoin; coin < coins.length; coin++) {
        perm += memo(amount - coins[coin], coin, coins, dp);
    }

    return dp[amount][lastCoin] = perm;
}

public int change(int amount, int[] coins) {
    int[][] dp = new int[amount + 1][coins.length + 1];
    for(int i=0; i<=amount; i++){
        for(int j=0; j<=coins.length; j++){
            dp[i][j] = -1;
        }
    }

    return memo(amount, 0, coins, dp);
}
```

Tabulation

Permutation ways

Optimal

Ways →

1	0	1	1	1	3	2	5
---	---	---	---	---	---	---	---

Amount
(Chosen)

$\{ "0" \}$

1

2

3

4

5

6

7

$\{ "2" \}$

$\{ "3" \}$

$\{ "22" \}$

$\{ "32" \}$

$\{ "23" \}$

$\{ "33" \}$

$\{ "222" \}$

$\{ "232" \}$

$\{ "322" \}$

Smaller



Bigger



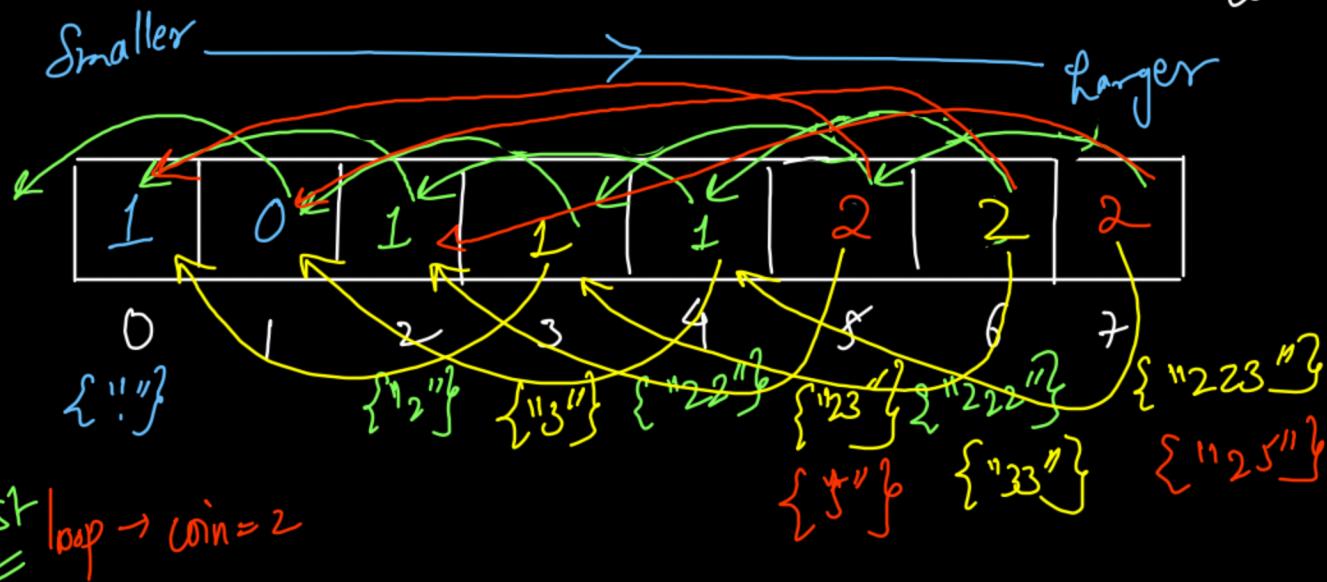
Coins = {2, 3, 5, 7}
target = 7

Tabulation

```
// Time - O(Amount * Coins), Space - O(Amount)
for(int i=1; i<= amount; i++){
    for(int coin: coins){
        if(i >= coin){
            dp[i] += dp[i - coin];
        }
    }
}
return dp[amount];
```

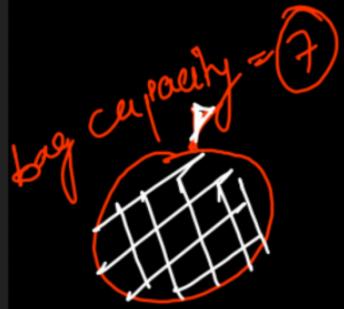
Combination (Tabulation)

target = 7
coins = {2, 3, 5}



Tabulation

```
public int change(int amount, int[] coins) {  
    int[] dp = new int[amount + 1];  
    dp[0] = 1; // Ways to reach dest when src = dest is 1.  
  
    // Time - O(Amount * Coins), Space - O(Amount)  
    for(int coin: coins)  
        for(int i=coin; i<= amount; i++)  
            dp[i] += dp[i - coin];  
  
    return dp[amount];  
}
```

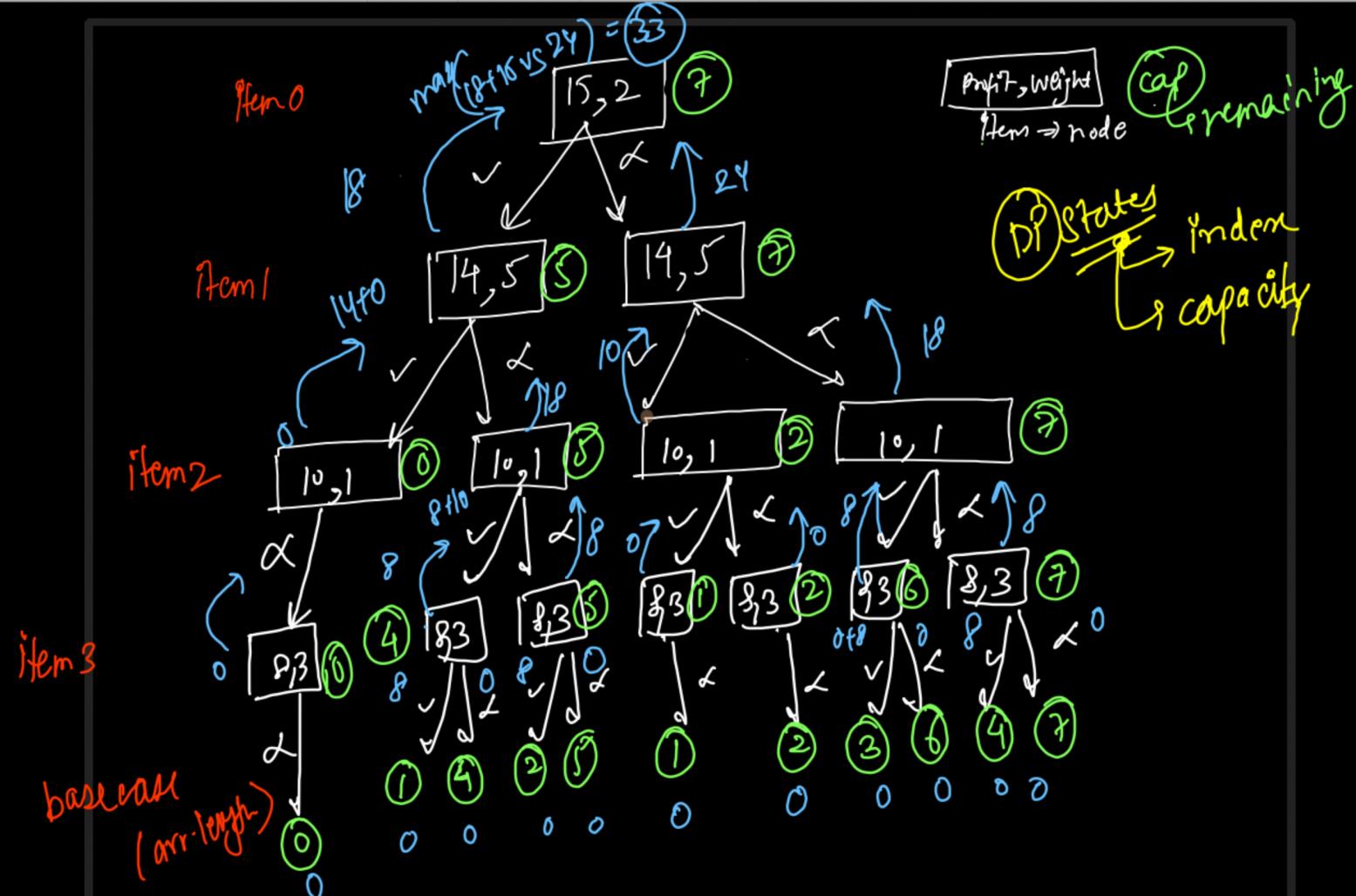


0-1 Knapsack

cost	15	14	10	8	20
weight	2	5	1	3	4
	i ₀	i ₁	i ₂	i ₃	i ₄

constraint

- Maximum loot(profit) → Sort in decreasing order of cost array (greedy ① fails)
- items selected
Weight sum \leq capacity → Sort in increasing order of weight array (greedy ② fails)
- You can either take the item in entirety or do not take the item $\rightarrow \left(\text{Sort in } \frac{\text{cost}}{\text{weight}} \right)$ (greedy ③ fails)
because item is not divisible



```

static int memo(int cap, int item, int[] wt, int[] cost, int[][] dp){
    if(item == cost.length) return 0; // No Item No Profit
    if(dp[cap][item] != -1) return dp[cap][item];

    int yes = (cap >= wt[item]) ?
        memo(cap - wt[item], item+1, wt, cost, dp) + cost[item]: -1;
    int no = memo(cap, item+1, wt, cost, dp);

    return dp[cap][item] = Math.max(yes, no);
}

static int knapSack(int cap, int wt[], int cost[], int n)
{
    int[][] dp = new int[cap + 1][cost.length];
    for(int i=0; i<=cap; i++){
        for(int j=0; j<cost.length; j++){
            dp[i][j] = -1;
        }
    }

    return memo(cap, 0, wt, cost, dp);
}

```

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

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

$O(\text{cap})$

$O(\text{item})$

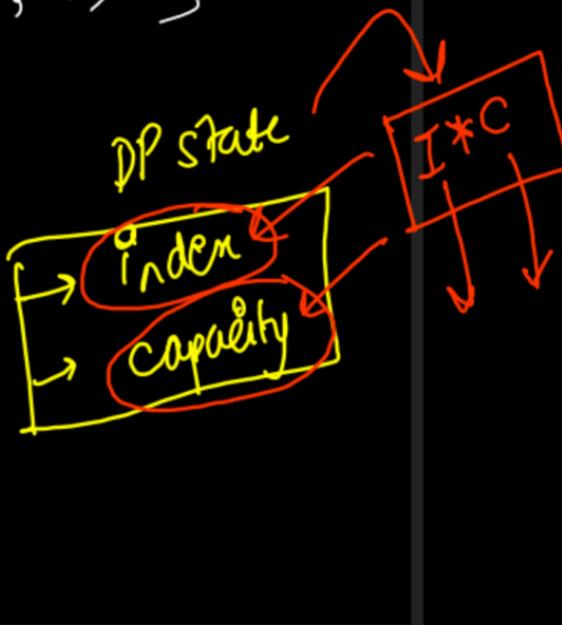
Space optimization? Yes
 ↪ Tabulation
 ↪ 1D DP
 $O(\text{cap})$

Overlapping Subproblems



$$\left\{ \begin{array}{c} 15, 14, 8 \\ 0 \quad 1 \quad 2 \end{array} \right\} \text{ cap = (16)}$$
$$\left\{ \begin{array}{c} 7, 7, 2 \\ 0 \quad 1 \quad 2 \end{array} \right\}$$

Recursion items
2



Tabulation
DP Table

Follow up: space optimization (?)

items (col)

Items = 4, capacity = 7

	No item	(15, 2)	(14, 5)	(10, 1)	(8, 3)	
0	0	0	0	0	0	
1	0	0 vs -1	0	0 vs 10 + 0	10	10 vs -1
2	0	0 vs 15 + 0	15	15 vs -1	15	15 vs 10 + 0
3	0	0 vs 15 + 0	15	15 vs -1	15	15 vs 10 + 15
4	0	0 vs 15 + 0	15	15 vs -1	15	15 vs 10 + 15
5	0	0 vs 15 + 0	15	15 vs 14 + 0	15	15 vs 10 + 15
6	0	0 vs 15 + 0	15	15 vs 14 + 0	15	15 vs 10 + 15
7	0	0 vs 15 + 0	15	15 vs 14 + 15	29	29 vs 10 + 15
						29 vs 8 + 25
						33

```

static int knapSack(int caps, int wt[], int cost[], int n)
{
    int[] dp = new int[caps + 1];

    for(int item=1; item<=cost.length; item++){
        int[] newDp = new int[caps + 1];

        for(int cap=1; cap<=caps; cap++){

            int no = dp[cap];
            int yes = (cap >= wt[item - 1])
                ? cost[item - 1] + dp[cap - wt[item - 1]]
                : -1;

            newDp[cap] = Math.max(yes, no);
        }

        dp = newDp;
    }

    return dp[caps];
}

```

Space Opt

TC $\rightarrow O(J \times C)$

SC $\rightarrow O(Cap)$

(P)

```

int[][] dp = new int[caps + 1][cost.length + 1];

for(int item=1; item<=cost.length; item++){
    for(int cap=1; cap<=caps; cap++){

        int no = dp[cap][item - 1];
        int yes = (cap >= wt[item - 1])
                  ? cost[item - 1] + dp[cap - wt[item - 1]][item - 1]
                  : -1;

        dp[cap][item] = Math.max(yes, no);
    }
}

return dp[caps][cost.length];

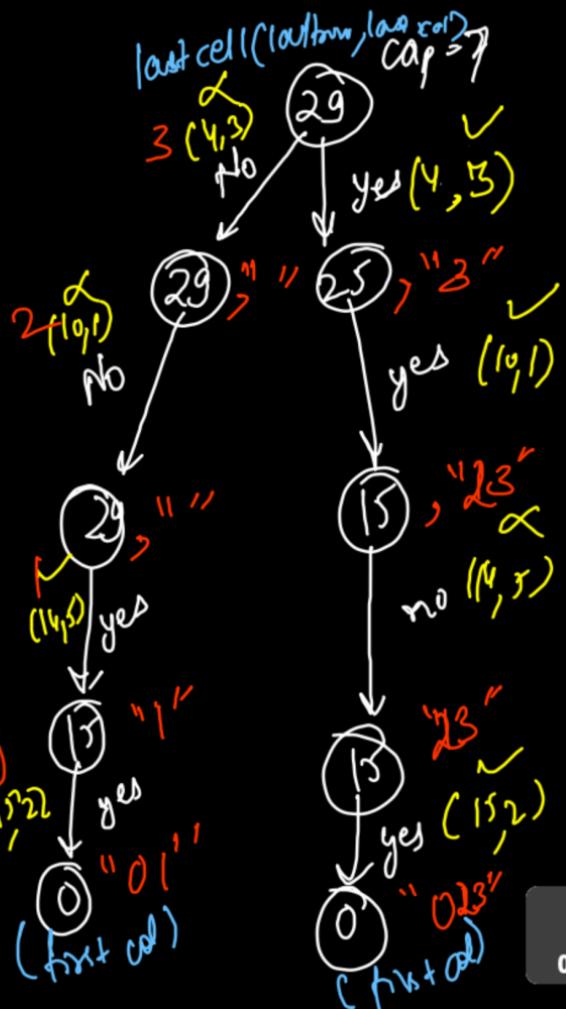
```

$T_C \Rightarrow O(\text{Items} * \text{Cap})$
 $S_C \Rightarrow O(\text{Items} * \text{Cap}) \{ 2P \}$

Point Always to select items in Knapsack such that maximum profit is achieved

Shatter		0	0	0	0	0	0
0	0	0 vs -1	0	0 vs -1	0	0 vs 10+0	10
1	0	0 vs 15+0	15	15 vs -1	15	15 vs 10+0	15
2	0	0 vs 15+0	15	15 vs -1	15	15 vs -1	15
3	0	0 vs 15+0	15	15 vs -1	15	15 vs 10+15	25
4	0	0 vs 15+0	15	15 vs -1	15	15 vs 10+15	25
5	0	0 vs 15+0	15	15 vs 14+0	15	15 vs 10+15	25
6	0	0 vs 15+0	15	15 vs 14+0	15	15 vs 10+15	25
7	0	0 vs 15+0	15	15 vs 14+15	29	29 vs 10+15	29
						29 vs 4+25	29

#for Back tracking
src → last cell
dest → first col



BFS

```
Queue<Pair> q = new ArrayDeque<>();
q.add(new Pair(caps, cost.length, ""));

while(q.size() > 0){
    Pair top = q.remove();
    int row = top.row;
    int col = top.col;
    String psf = top.psf;

    if(top.col == 0){ /
        System.out.println(top.psf);
        continue;
    }

    // If Item Can be Included and It gives Maximum Profit, then explore this
    if([row >= wt[col - 1] &&
       dp[row][col] == cost[col - 1] + dp[row - wt[col - 1]][col - 1]){

        q.add(new Pair(row - wt[col - 1], col - 1, (col - 1) + " " + psf));
    }

    // If no call gives maximum profit, then only explore this edge
    if(dp[row][col] == dp[row][col - 1]){
        q.add(new Pair(row, col - 1, psf));
    }
}
```

PRAG

$T.C \Rightarrow O(\text{exponential})$
in worst case
 $O(V \times E)$ BFS
in avg case

$S.C \Rightarrow O(Col * N)$ DP
 $O(I^{avg} * Col)$ Queue

Dynamic Programming

Lecture 12

Saturday, 9 AM - 12 PM, 7 May

- Knapsack
 - Unbounded Knapsack
 - Rod Cutting
 - Buy & Sell Stocks

Unbounded Knapsack

Items

bag cap = 7

constraint

	cost	15	14	10	8	20
	weight	2	5	1	3	4
i ₀				i ₁		
i ₁					i ₂	
i ₂						i ₃
i ₃						i ₄

→ Maximum loot(profit)

→ items selected

Weight sum \leq capacity

→ Items cannot be divided

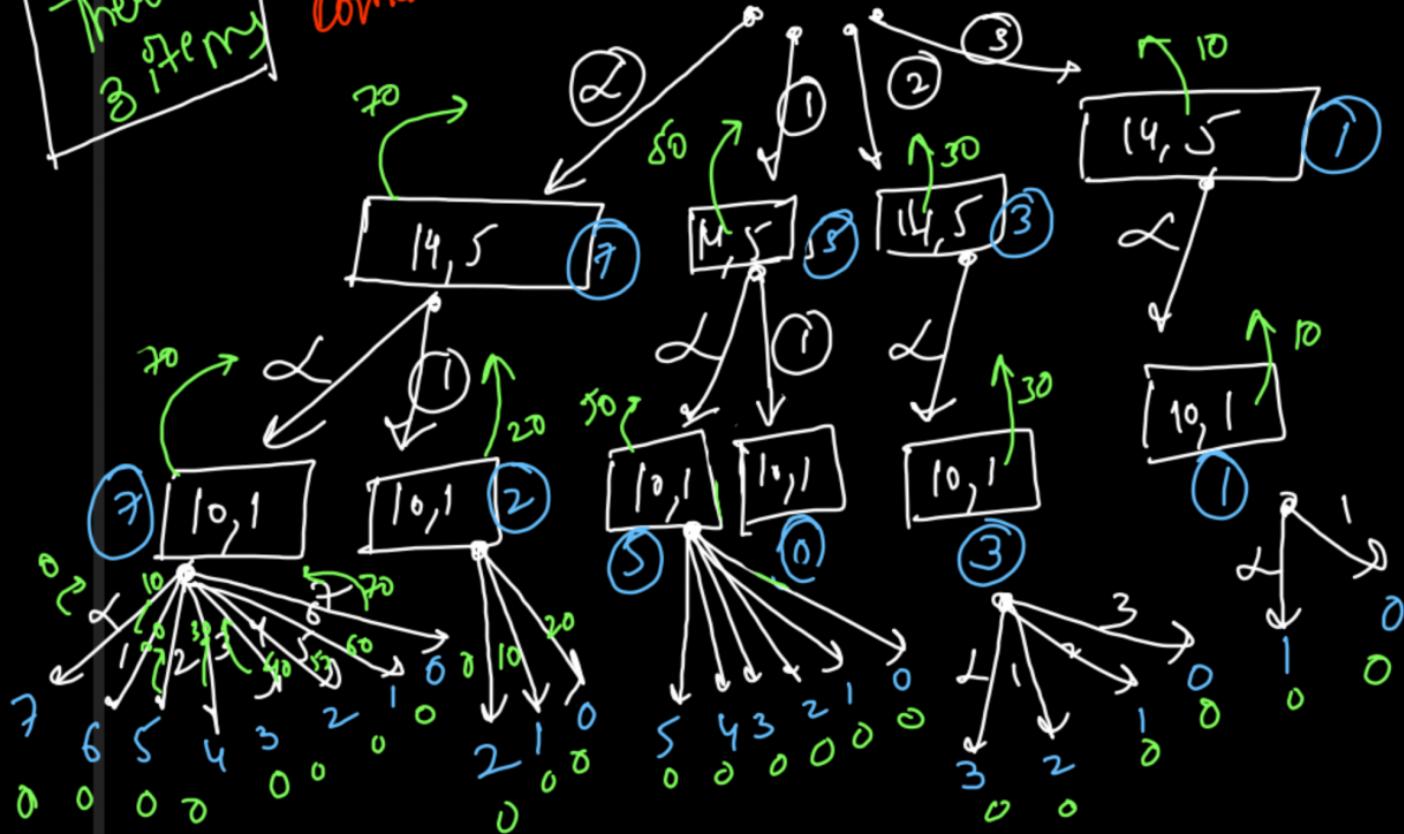
→ You have infinite supply
of each items

There are
3 items

Coin change
combination

15, 2 → 20
7

70 vs $50 + 15*1$ vs $30 + 15*2$
vs $10 + 15*3$
= 70



```
static int memo(int index, int cap, int cost[], int wt[], int N, int[][] dp){
    if(index == N || cap == 0) return 0;
    if(dp[index][cap] != -1) return dp[index][cap];

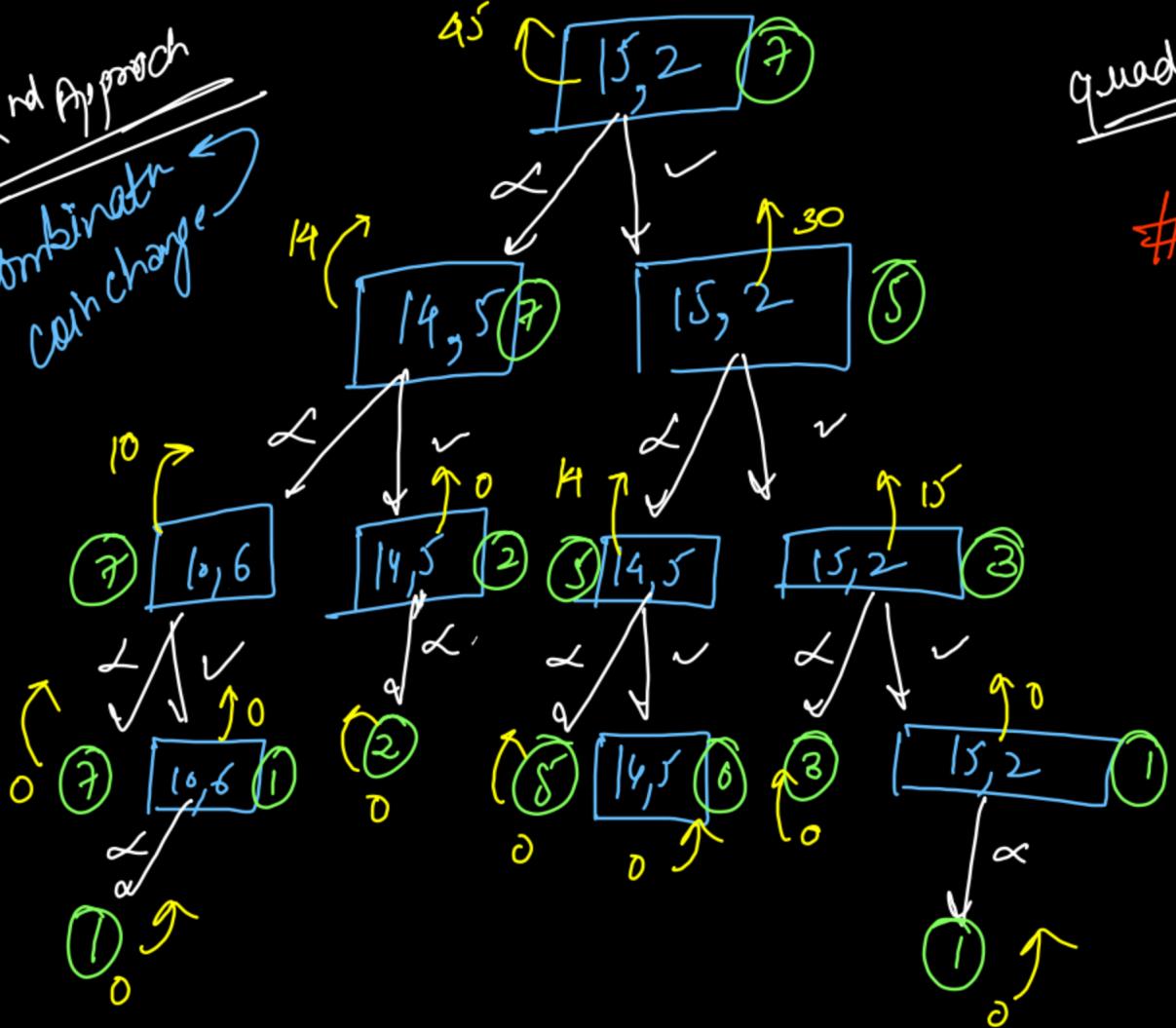
    int ans = -1;
    for(int freq=0; cap >= freq * wt[index]; freq++){
        int temp = memo(index + 1, cap - freq * wt[index], cost, wt, N, dp)
                  + freq * cost[index];
        ans = Math.max(ans, temp);
    }

    return dp[index][cap] = ans;
}
```

```
static int knapSack(int N, int cap, int cost[], int wt[]){
{
    int[][] dp = new int[N + 1][cap + 1];
    for(int i=0; i<=N; i++){
        for(int j=0; j<=cap; j++){
            dp[i][j] = -1;
        }
    }

    return memo(0, cap, cost, wt, N, dp);
}
```

2nd Approach
Combination
coin change



quadratic

DP state
index cap

```

static int memo(int index, int cap, int cost[], int wt[], int N, int[][] dp){
    if(index == N || cap == 0) return 0;
    if(dp[index][cap] != -1) return dp[index][cap];

    int no = memo(index + 1, cap, cost, wt, N, dp);
    int yes = (cap >= wt[index])
        ? cost[index] + memo(index, cap - wt[index], cost, wt, N, dp) : -1;

    return dp[index][cap] = Math.max(yes, no);
}

static int knapSack(int N, int cap, int cost[], int wt[])
{
    int[][] dp = new int[N + 1][cap + 1];
    for(int i=0; i<=N; i++){
        for(int j=0; j<=cap; j++){
            dp[i][j] = -1;
        }
    }

    return memo(0, cap, cost, wt, N, dp);
}

```

TC
 $O(N \times \text{cap})$

SC
 $2^N \cdot \text{DP}$
 $O(N \times \text{cap})$

(Cap)

0 1 2 3 4 5 6 7

0

0 ↑

6

0 ↑

0

0 ↑

0

0

Fence

$\boxed{(\sqrt{1}, 2)}$

1

0

$0 \text{ vs } 15 + 0$

$0 \text{ vs } 15 + 0$

$0 \text{ vs } 15 + 0 + 15$

$0 \text{ vs } 15 + 0 + 15 + 0$

$0 \text{ vs } 15 + 0 + 15 + 0 + 15$

$0 \text{ vs } 15 + 0 + 15 + 0 + 15 + 0$

$0 \text{ vs } 15 + 0 + 15 + 0 + 15 + 0 + 15$

0

$\boxed{\frac{6}{1}, 5}$

2

0

0 ↑

15

15

30

34

45

49

60

$\boxed{\frac{6}{3}, 3}$

3

0

0 ↑

15

$15 + 15 + 30 + 0$

$30 + 30 + 0$

$34 + 30 + 15$

$45 + 45 + 60$

$49 + 60 + 60$

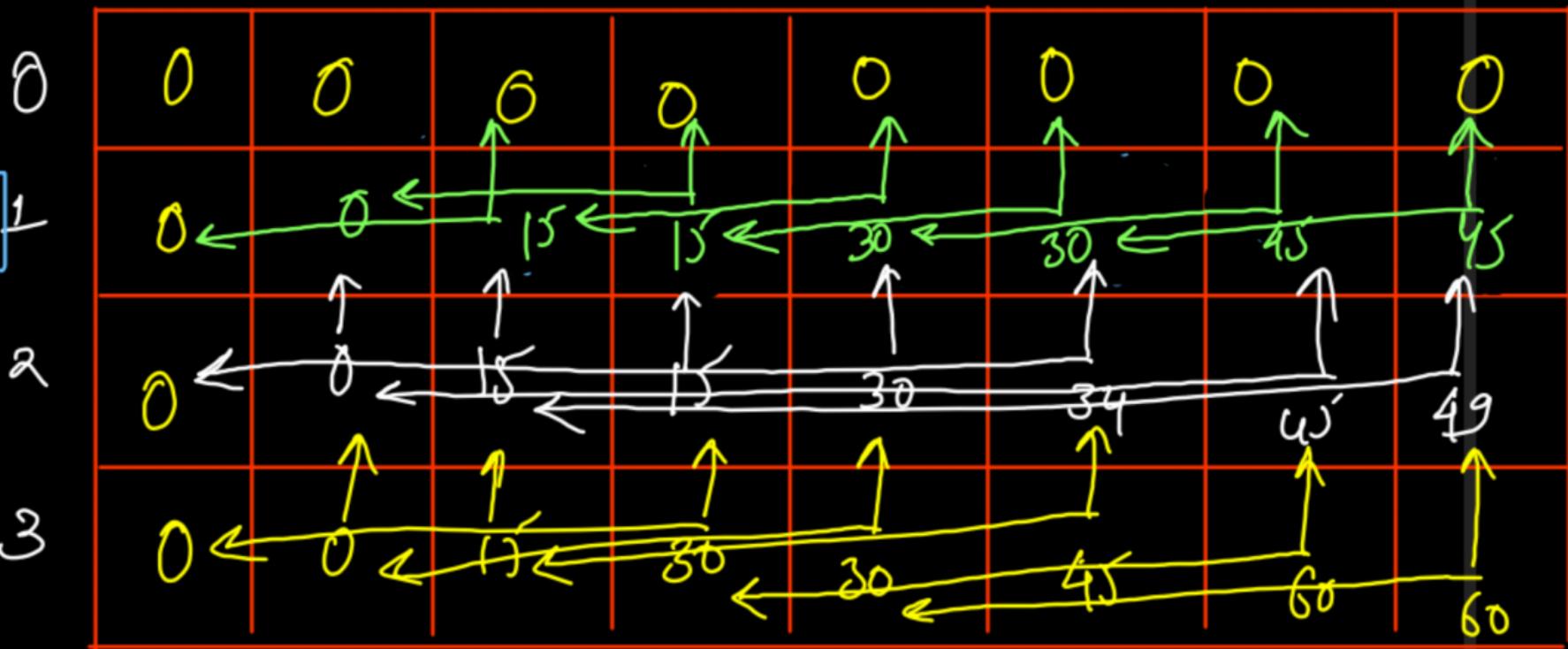
$60 + 60 + 60$

60

0	1	2	3	4	5	6	7
0	0 ↑	6	0 ↑	0	0 ↑	0	0
0	0	15	15	$15 + 30$	$0 + 15 + 2$	$30 + 45$	$0 + 54 + 5$
0	0	15	15	$15 + 30 + 0$	$30 + 30 + 0$	$30 + 0 + 34$	$45 + 45 + 34$
0	0	15	15	$15 + 15 + 30 + 0$	$30 + 30 + 0$	$34 + 30 + 15$	$45 + 45 + 60$
0	0	15	30	$30 + 30 + 0$	$34 + 30 + 15$	$45 + 45 + 60$	$49 + 60 + 60$
0	0	15	30	$30 + 30 + 0$	$45 + 45 + 60$	$60 + 60 + 60$	$60 + 60 + 60$
0	0	15	30	$30 + 30 + 0$	$45 + 45 + 60$	$60 + 60 + 60$	$60 + 60 + 60$

(Cap)

0 1 2 3 4 5 6 7



Fluxes

$$\boxed{(W, 2)}$$

$$\boxed{34, 5}$$

$$\boxed{30, 3}$$

```
static int knapSack(int N, int caps, int cost[], int wt[])
{
    int[][] dp = new int[N + 1][caps + 1];

    for(int item=1; item<=N; item++){
        for(int cap=1; cap<=caps; cap++){
            int no = dp[item - 1][cap];
            int yes = (cap >= wt[item - 1])
                ? dp[item][cap - wt[item - 1]] + cost[item - 1]
                : -1;

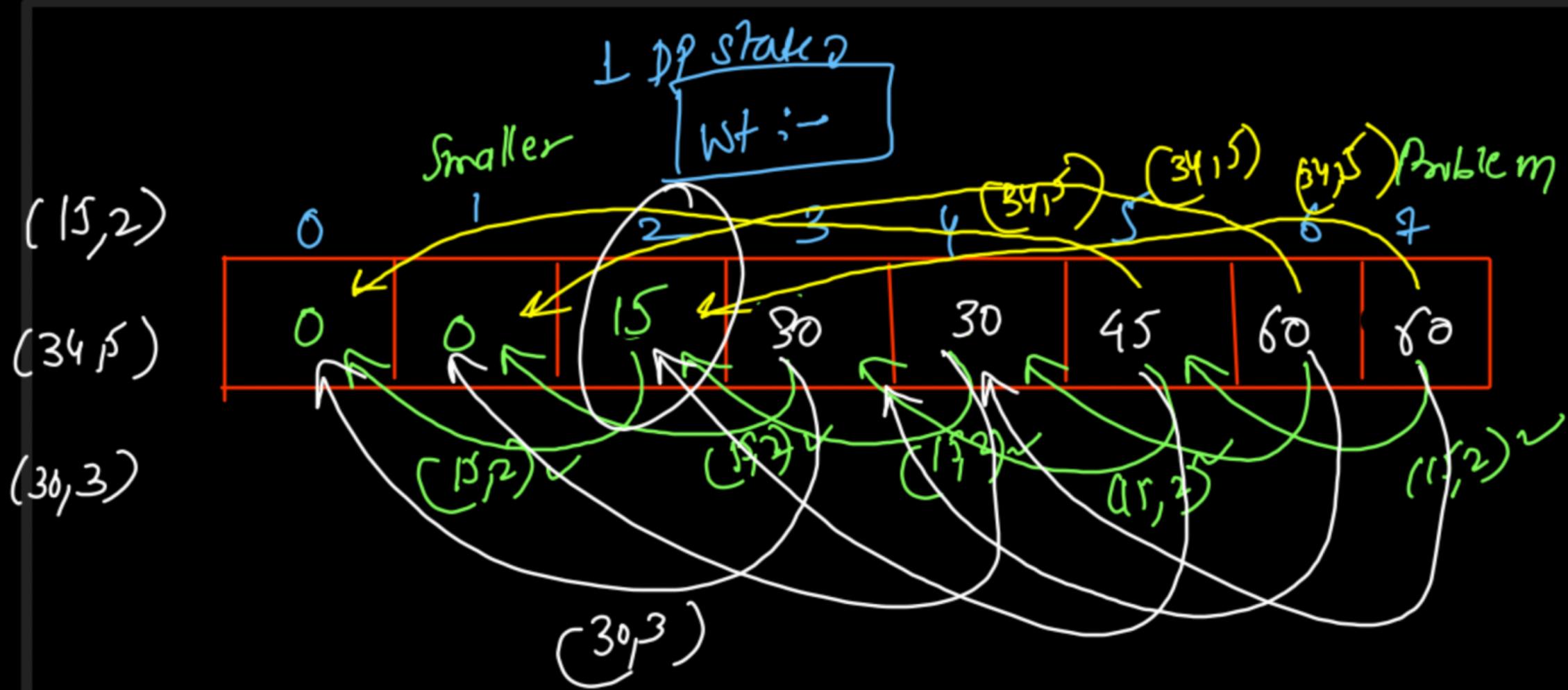
            dp[item][cap] = Math.max(no, yes);
        }
    }

    return dp[N][caps];
}
```

2D DP

TC $\rightarrow \Theta(N * caps)$

SC $\rightarrow \Theta(N * caps)$



```

static int knapSack(int N, int caps, int cost[], int wt[])
{
    int[] dp = new int[caps + 1];

    for(int item=1; item<=N; item++){
        for(int cap=1; cap<=caps; cap++){
            int no = dp[cap];
            int yes = (cap >= wt[item - 1])
                ? dp[cap - wt[item - 1]] + cost[item - 1]
                : -1;

            dp[cap] = Math.max(no, yes);
        }
    }

    return dp[caps];
}

```

ID DP

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

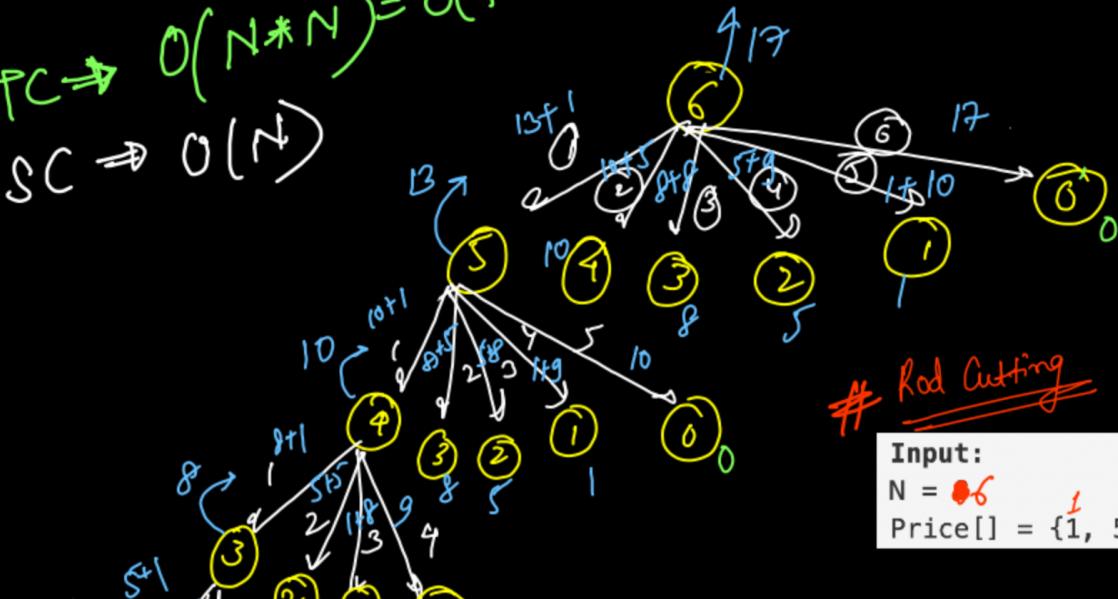
$O(cap)$

SC \rightarrow

$\left\{ \begin{array}{l} \text{Infinite Supply} \rightarrow \text{yes} \rightarrow \text{same row} \\ \text{Limited Supply} \rightarrow \text{yes} \rightarrow \text{previous row} \end{array} \right\} \left\{ \begin{array}{l} \text{No call} \\ \text{inf} \diagdown \text{frnly} \\ \text{prev row} \end{array} \right\}$

TC $\Rightarrow O(N \cdot N) = O(N^2)$

SC $\Rightarrow O(N)$

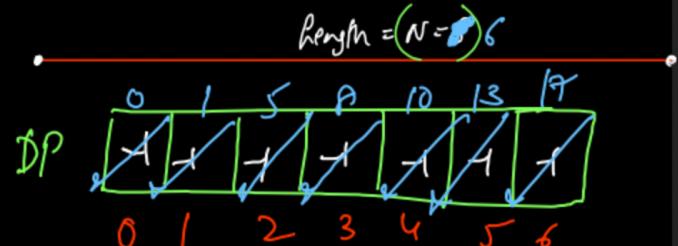


Rod Cutting

Input:

N = 6

Price[] = {1, 5, 8, 9, 10, 17, 13, 11, 14, 12, 16, 15}



$DP[i] = \max^n \text{ profit of that length}$

Variations of
Knapsack
problems
Climb stairs
Minimizing cost

```
class Solution{
    public int memo(int n, int price[], int[] dp){
        if(n == 0) return 0;
        if(dp[n] != -1) return dp[n];

        int ans = 0;
        for(int cut=1; cut<=n; cut++){
            ans = Math.max(ans, price[cut - 1] + memo(n - cut, price, dp));
        }

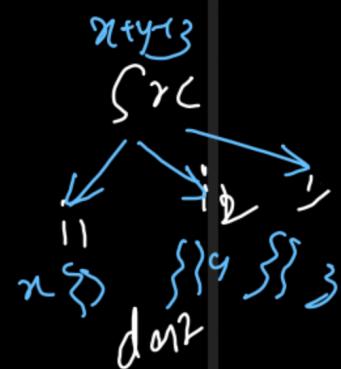
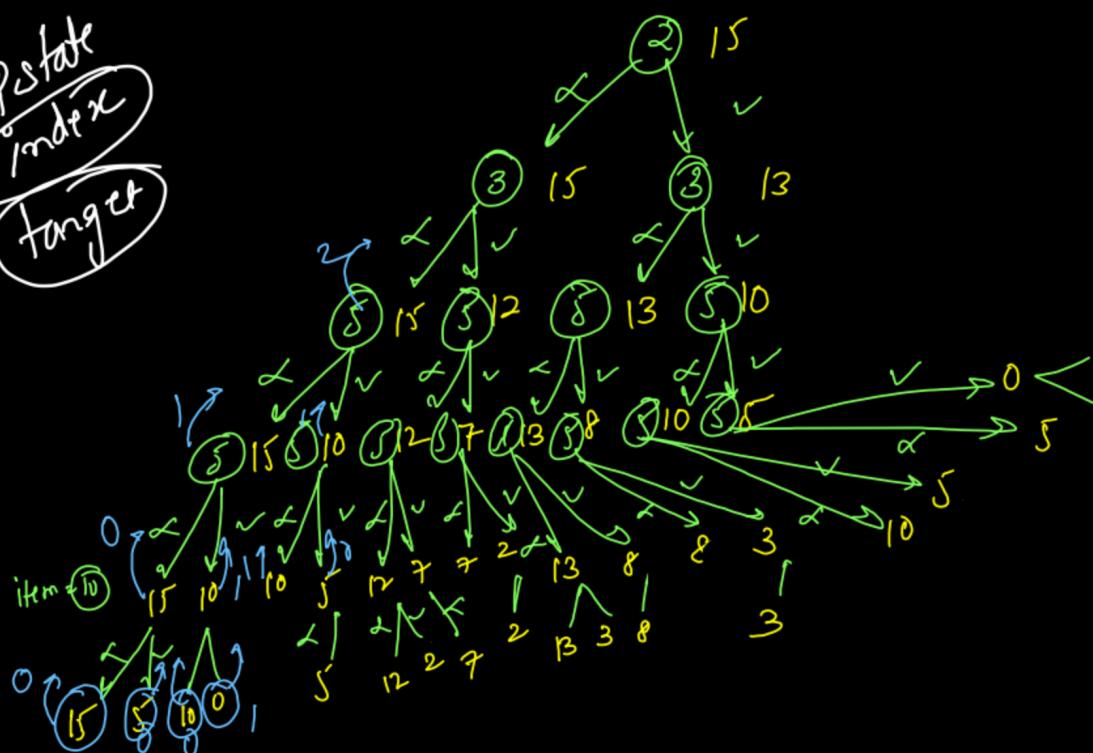
        return dp[n] = ans;
    }

    public int cutRod(int price[], int n) {
        int[] dp = new int[n + 1];
        Arrays.fill(dp, -1);
        return memo(n, price, dp);
    }
}
```

Target sum subset (0-1 knapsack)

$\{2, 3, 5, 5, 10\}$ target = $\boxed{15}$

DPS state
index x
target



Dynamic Programming - lecture 13

Sunday, 8 May, 9 AM - 12 PM

Buy & Sell Stocks

- Variations
- Fibonacci
- House Robber
- Knapsack

121 Buy & Sell Stocks - 1 Transaction

You are given an array `prices` where `prices[i]` is the price of a given stock on the i^{th} day.

You want to maximize your profit by choosing a **single day** to buy one stock and choosing a **different day in the future** to sell that stock.

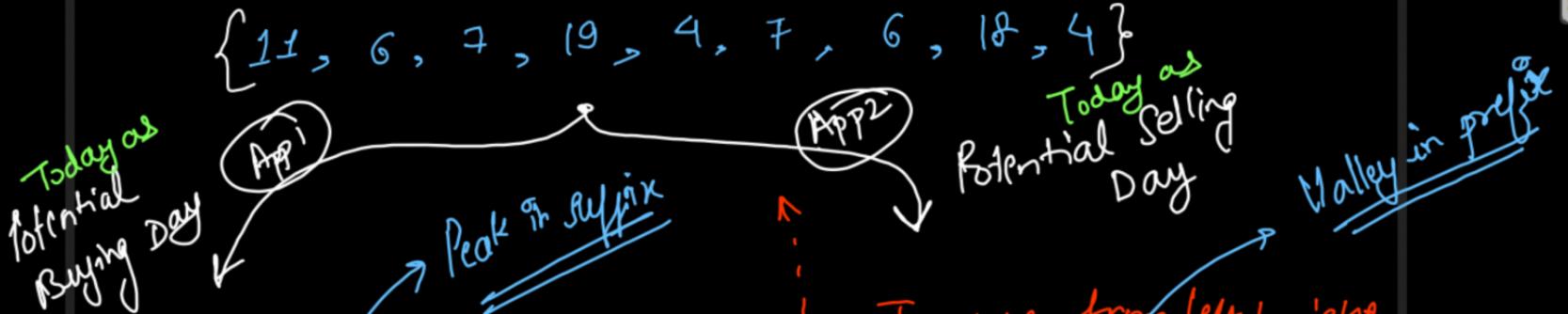
Return the maximum profit you can achieve from this transaction. If you cannot achieve any profit, return `0`.

Constraint



BBSS \propto

$$\{11, 6, 7, 19, 4, 1, 6, 18, 4\}$$



Traverse from right to left
 Take \max^m of suffix

$$\text{Profit} = (\max^m - \text{cost[today]})$$

$$\begin{aligned}
 & \{11, 6, 7, 19, 4, 7, 6, 18, 4\} \\
 & \uparrow \quad \uparrow \\
 & 11-11=0 \quad 19-6=13 \quad 19-7=12 \quad 19-9=0 \quad 18-4=14 \quad 18-7=11 \quad 18-6=12 \quad 18-18=0 \quad 14-4=10
 \end{aligned}$$

$$\max^m = \cancel{11} \cancel{19} \cancel{18} \cancel{10}$$

$$\text{profit} = \cancel{11} \cancel{19} \cancel{18} \cancel{10}$$

Traverse from left to right
 Take \min^m of prefix

$$\text{Profit} = (\text{cost[today]} - \min^m)$$

$$\begin{aligned}
 & \{11, 6, 7, 19, 4, 7, 6, 18, 4\} \\
 & \uparrow \quad \uparrow \\
 & 11-11=0 \quad 6-6=0 \quad 7-6=1 \quad 19-6=13 \quad 4-4=0 \quad 7-7=0 \quad 6-4=2 \quad 18-4=14 \quad 4-4=0
 \end{aligned}$$

$$\begin{array}{c}
 \min^m = \cancel{11} \cancel{6} \cancel{4} \\
 \text{Buying day}
 \end{array}$$

$$\text{Profit} = \cancel{11} \cancel{6} \cancel{4}$$

```
class Solution {
    public int maxProfit(int[] prices) {
        int n = prices.length;

        int selling = prices[n - 1], profit = 0;

        for(int i=n-1; i>=0; i--){
            selling = Math.max(selling, prices[i]);

            int buying = prices[i]; // Today - Potential Buying Day

            profit = Math.max(profit, selling - buying);
        }

        return profit;
    }
}
```

$O(N)$ Time
 $O(1)$ Space

App 1

```
public int maxProfit(int[] prices) {
    int n = prices.length;

    int buying = prices[0], profit = 0;

    for(int i=0; i<n; i++){
        buying = Math.min(buying, prices[i]);

        int selling = prices[i]; // Today - Potential Selling Day

        profit = Math.max(profit, selling - buying);
    }

    return profit;
}
```

App 2

122. Best Time to Buy and Sell Stock II

Infinite Transaction

#BBS is not possible
#BSBS is possible

$$\left\{ 11, \textcircled{6}, \textcircled{7}, \textcircled{19}, 4, \textcircled{1}, \textcircled{6}, \textcircled{18}, \textcircled{4}, \textcircled{12}, 2 \right\}$$

$19 - 7 = 12 \checkmark$

$7 - 6 = 1$

$18 - 4 = 12 \checkmark$

$6 - 1 = 5$

$12 - 4 = 8 \checkmark$

(Top) buying day = $\cancel{11} \cancel{6} \cancel{7} \cancel{19} \cancel{4} \cancel{1} \cancel{6} \cancel{18} \cancel{4} \cancel{12} \cancel{2}$

profit = $0 + 1 + 12 + 5 + 12 + 8$

11	$\cancel{6}$	$\cancel{7}$	19	4	$\cancel{1}$	$\cancel{6}$	18	$\cancel{4}$	12	2
----	--------------	--------------	----	---	--------------	--------------	----	--------------	----	---

```

class Solution {
    public int maxProfit(int[] prices) {
        Stack<Integer> stk = new Stack<>();
        int profit = 0;

        for(int i=0; i<prices.length; i++){
            if(stk.size() > 0 && stk.peek() < prices[i]){
                profit += prices[i] - stk.pop();
            }

            stk.push(prices[i]);
        }

        return profit;
    }
}

```

$O(N)$ time
 $O(N)$ space
Greedy Approach

```

class Solution {
    public int maxProfit(int[] prices) {
        int buying = prices[0];
        int profit = 0;

        for(int i=0; i<prices.length; i++){
            if(buying < prices[i]){
                profit += prices[i] - buying;
            }

            buying = prices[i];
        }

        return profit;
    }
}

```

$O(N)$ time
 $O(1)$ space

DP

Buy & Sell Stock - Infinite Transaction
 - Transaction fee
 - Cooldown

$\{11, 6, 7, 9, 4, 1, 6, 18, 4\}$

(1 Extra Stock)
 Buy
 (0 extra Stock)
 Sell

-11	-11 vs -6	-7 vs -6	-6 vs -18	6 vs -4 + 13	9 vs 13 - 1	13 - 6 vs 12	18 - 18 vs 12	12 vs 30 - 4
0	0 vs -11 + 6	1 vs 0	13 vs 1	-2 vs 13	13 vs 9 + 1	13 vs 12 + 6	18 vs 12 + 8	30 vs 12 + 4

Today's
Potential Buying Day

$$dp[\text{Buy}] = \max(dp[\text{Buy-1}], dp[\text{sell-1} - \text{cost}[i]])$$

Do not buy today

Today's
Potential
Selling Day

$$dp[\text{sell}] = \max(dp[\text{sell-1}], dp[\text{buy-1}] + \text{cost}[i])$$

Do not sell
today

with 0 Stock

Prev profit - Today's Buy by cost

with 1 stock

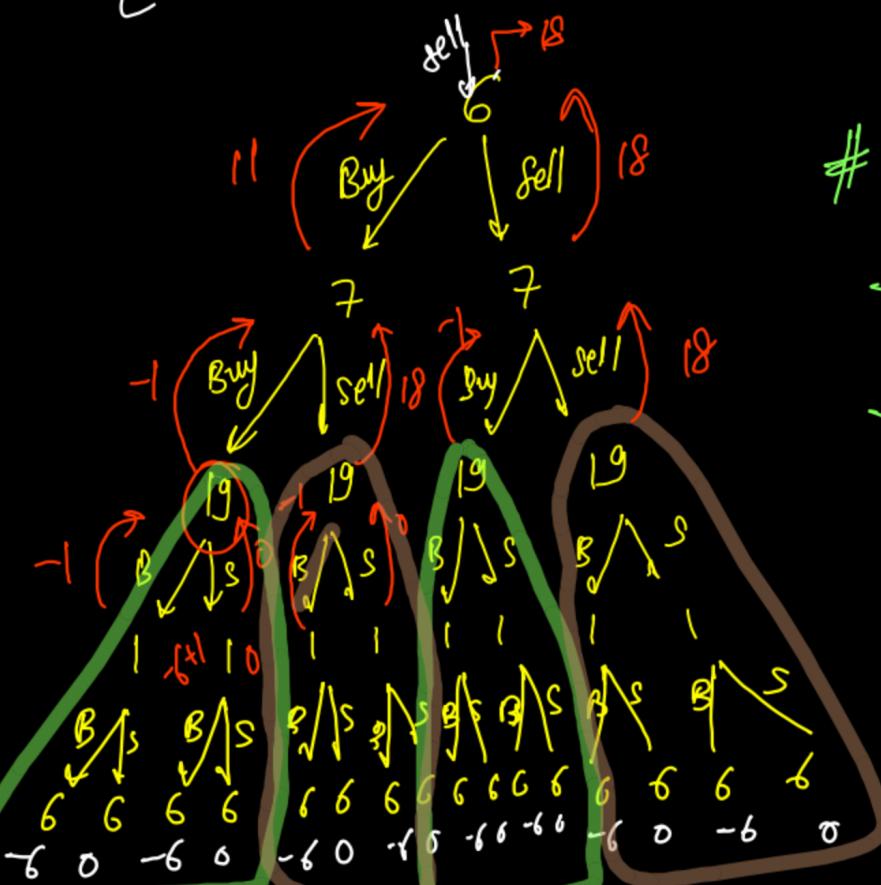
in hand

Prev profit + Today's selling
cost

$$\{6, 7, 19 > 1, 6\}$$

Constraints

BXSS ~~BXSS~~



DP State

→ Buy / sell (Row)

→ Days (col)

```

public int maxProfit(int[] prices) {
    int[] buy = new int[prices.length];
    int[] sell = new int[prices.length];

    buy[0] = -prices[0];
    sell[0] = 0;

    for(int i=1; i<prices.length; i++){
        // Treat today as Buying Day
        buy[i] = Math.max(buy[i - 1], sell[i - 1] - prices[i]);

        // Treat today as Selling Day
        sell[i] = Math.max(sell[i - 1], buy[i - 1] + prices[i]);
    }

    return sell[prices.length - 1];
}

```

```

public int maxProfit(int[] prices) {
    int buy = -prices[0];
    int sell = 0;

    for(int i=1; i<prices.length; i++){
        // Treat today as Buying Day
        int newBuy = Math.max(buy, sell - prices[i]);

        // Treat today as Selling Day
        int newSell = Math.max(sell, buy + prices[i]);

        buy = newBuy; sell = newSell;
    }

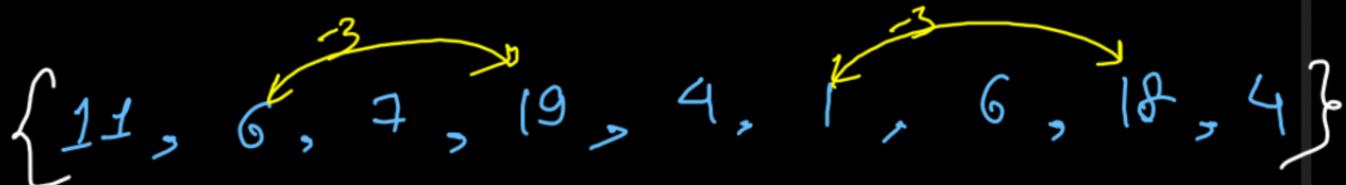
    return sell;
}

```

$O(N)$ DP
 Time
 $O(N)$ Space

$O(N)$ DP Time
 $O(1)$ Constant Space

transaction fee \Rightarrow +3 on completion of every transaction ($B \rightarrow S$)



(Initial State)
Buy
Sell
(extra
Stock)

-11	-11 vs -6	-6 vs 0-7	-6 vs 0-9	-6 vs 10-4	6 vs 10-1	9 vs 10-1	9 vs 12-18	9 vs 24-4
0	$0 + (-11) = -11$	$0 + (-6) = -6$	$0 + (-7) = -7$	$0 + (-9) = -9$	$10 + (-6) = 4$	$10 + (-1) = 9$	$12 + (-18) = -6$	$24 + (-4) = 20$

$$dp[\text{buy}] = dp[\text{buy-1}], (dp[\text{sell-1}] - \text{cost}[i])$$

$$dp[\text{sell}] = dp[\text{sell-1}], (dp[\text{buy-1}] + \text{cost}[i] - \text{fee})$$

```
public int maxProfit(int[] prices, int fee) {  
    int buy = -prices[0];  
    int sell = 0;  
  
    for(int i=1; i<prices.length; i++){  
  
        // Treat today as Buying Day  
        int newBuy = Math.max(buy, sell - prices[i]);  
  
        // Treat today as Selling Day  
        int newSell = Math.max(sell, buy + prices[i] - fee);  
  
        buy = newBuy; sell = newSell;  
    }  
  
    return sell;  
}
```

$O(N)$ time, $O(1)$ constant space

