

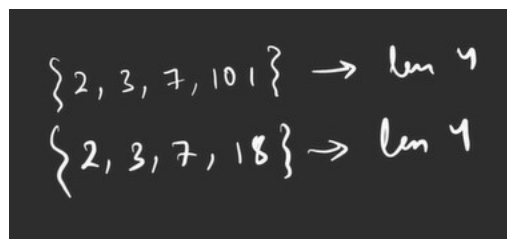
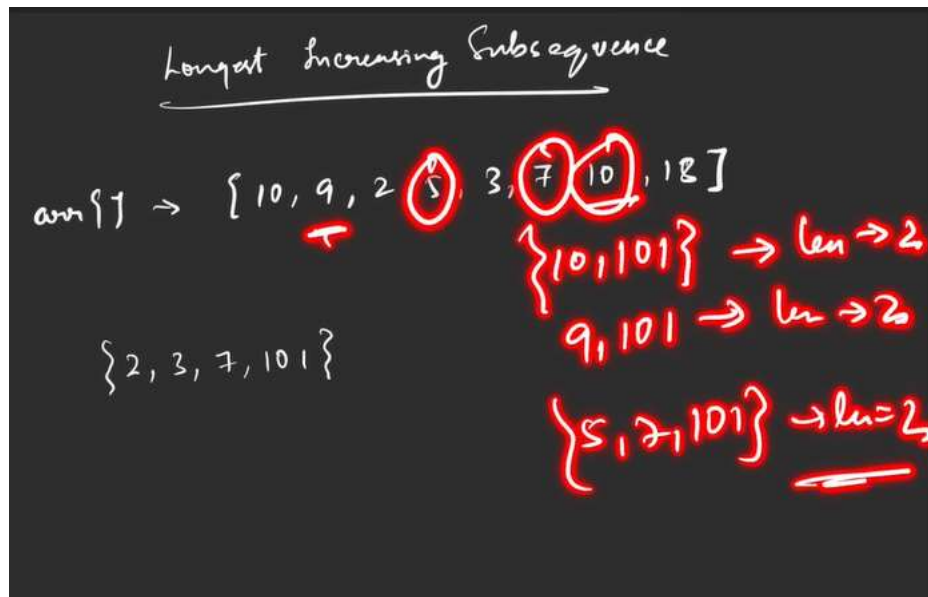
Dynamic Programming

13 September 2023

11:00 AM

Longest Common Subsequence

Contiguous sequence of an array is called sub-sequence



Return length of longest increasing subsequence.

We will follow the approach of (pick / not pick)

Brute force $O(2^n)$

We can print all the subsequences using power set

Check for increasing

Store the longest one and return it

Optimised approach

We can write a recurrence relation

Express everything in terms of index

Explore all possibilities

Take max length of (pick, not pick)

We take 10 but to take or not take next element in subsequence we need to have store of previous index

So we take (index, prev index)

$f(3,0)$ means length of LIS starting from index = 3 whose previous index is 0

If we do not pick any index due to any condition then our function becomes $f(\text{index}+1, \text{previous})$

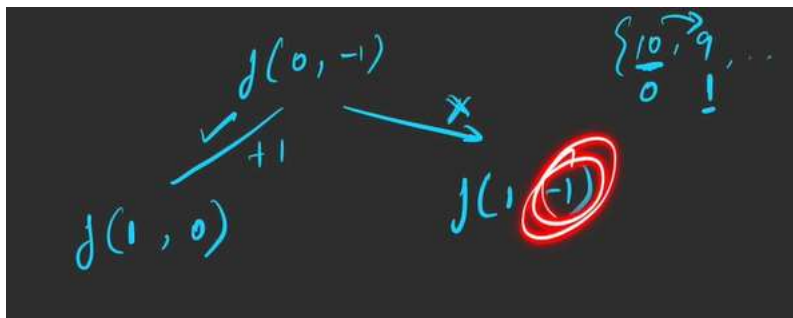
The previous index will remain same, but we skip the current index and move to next index.

And we know our $f(\text{index}, \text{prev})$ returns us the length so if we are not picking up a index, will it make any change in length of our LIS?

No, it does not so we return it like

return 0 + $f(\text{index}+1, \text{previous})$ // Not-take case

We start by picking or not picking the index = 0 where previous = -1



if we are **taking an index**, our previous changes and our length increases but keeping in mind the condition

$$\text{if } (\text{prev} == -1 \parallel \text{arr}[\text{ind}] > \text{arr}[\text{prev-ind}])$$
$$1 + f(\text{ind}+1, \text{ind})$$

So now max length is maximum of pick/not pick

$$\text{len} = 0 + f(\text{ind}+1, \text{prev-ind}) \quad // \text{not-Take}$$
$$\text{if } (\text{prev} == -1 \parallel \text{arr}[\text{ind}] > \text{arr}[\text{prev-ind}])$$
$$\text{len} = \max(\text{len}, 1 + f(\text{ind}+1, \text{ind})) \quad // \text{Take}$$
$$\text{return len};$$

What will be the base case:

If we have reached the end of array, means we do not have anything to add in length so return 0

```
if (ind == n) return 0;
```

Complexity:

TC: 2^n for take / not take

SC: $O(n)$

To optimise this, we look for over-lapping sub-problems

We convert them to memoization

We are taking index from 0 to n, so we can take an array of [N]

We are taking index from -1 to n-1 for previous but how to store -1 in array?

We will do coordinate shifting and shift

-1 \rightarrow 0

0 \rightarrow 1

1 \rightarrow 2

.

.

.

n-1 \rightarrow n

So we take an array of [N+1]

So now our code changes to:

```
{
    if (ind == n) return 0;
    if (dp[ind][prev-ind+1] != -1) return dp[ind][prev-ind+1];

    len = 0 + j(ind+1, prev-ind); // not-Take

    if (prev == -1 || arr[ind] > arr[prev-ind])
        len = max(len, 1 + j(ind+1, ind)); // take

    return len;
    dp[ind][prev-ind+1] = len;
}
```

Complexity changes to

$$\left\{ \begin{array}{l} TC \rightarrow O(N \times N) \\ SL \rightarrow O(N \times W) + O(N) \end{array} \right\}$$

Code

```
int longestLengthSubsequence(int index, int prev, int arr[], int n)
{
    if(index == n) return 0;
    // Not - take case
    int len = 0 + longestLengthSubsequence(index+1, prev, arr, n);
    // Take case
    if(prev == -1 || arr[index] > arr[prev])
    {
        // prev = -1 means first index
        // arr[index] > arr[prev] means it makes a valid increasing s
ubsequence
        // add +
        1 in length and move to next index, taking current index as previous
        // store the max length of take and not-
        takes case as we need longest increasing subsequence
        len = max(len, 1 + longestLengthSubsequence(index+
1, index, arr, n));
    }
    return len;
}
```

```
int longestIncreasingSubsequence(int arr[], int n)
{
    return longestLengthSubsequence(0, -1, arr, n);
}
```

Memoization code

```
int longestLengthSubsequence(int index, int prev, int arr[], int n,
vector<vector<int>> &dp)
{
    if(index == n) return 0;
    if(dp[index][prev+1] != -1) return dp[index][prev+1];
    // Not - take case
    int len = 0 + longestLengthSubsequence(index+1, prev, arr, n, dp);
    // Take case
    if(prev == -1 || arr[index] > arr[prev])
    {
        // prev = -1 means first index
        // arr[index] > arr[prev] means it makes a valid increasing s
ubsequence
        // add +
        1 in length and move to next index, taking current index as previous
        // store the max length of take and not-
```

```

    takes case as we need longest increasing subsequence
    len = max(len, 1+ longestLengthSubsequence(index+
1,index,arr,n,dp));
    }
    return dp[index][prev+1] = len;
}

```

```

int longestIncreasingSubsequence(int arr[], int n)
{
    // Memoization
    vector<vector<int>> dp(n,vector<int> (n+1,-1));
    return longestLengthSubsequence(0,-1,arr,n,dp);
}

```

Longest Common Subsequence

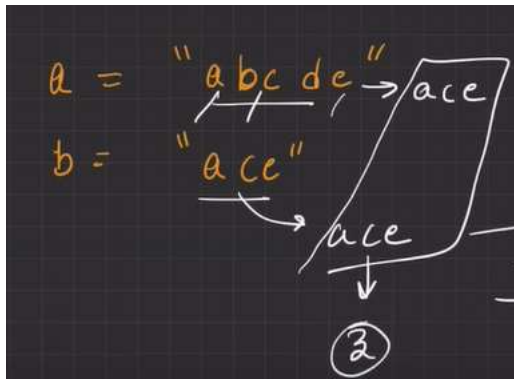
Given 2 strings, return longest subsequence from both string which are common to both strings, and is present in both the strings.

Subsequence means the relative ordering should be same.

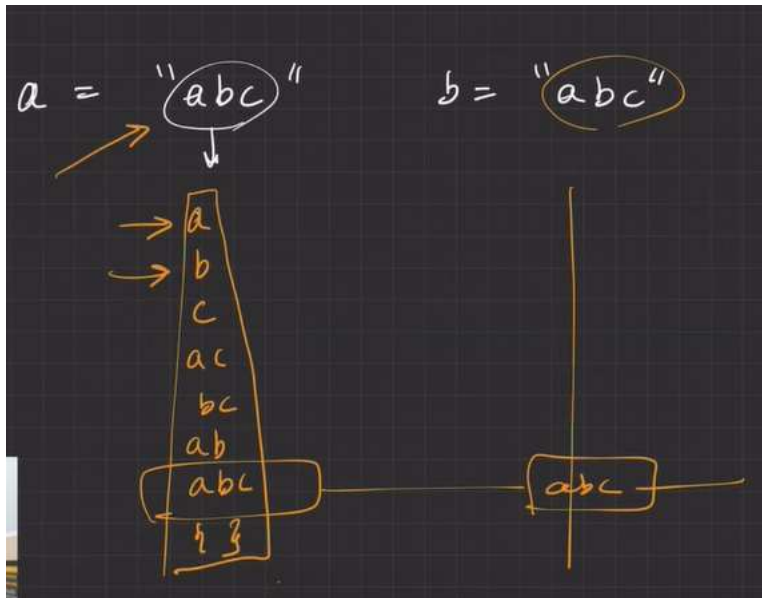
Like in below example:

"ace" is common in both strings with same relative ordering

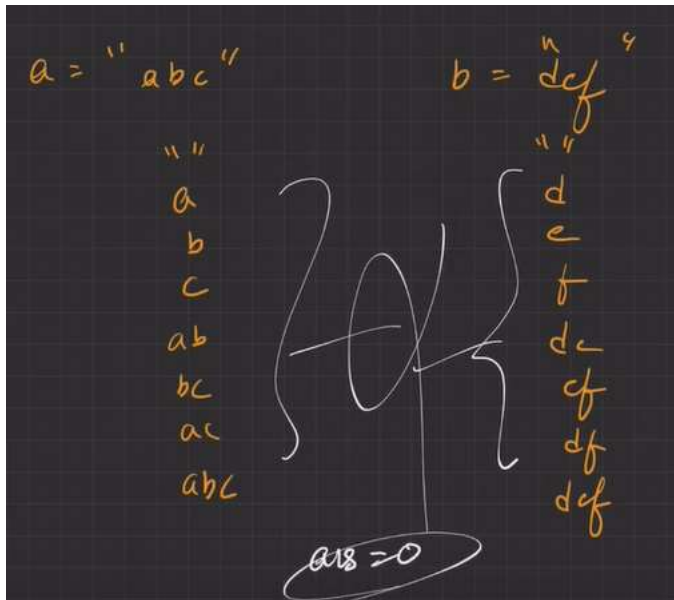
So we return length = 3



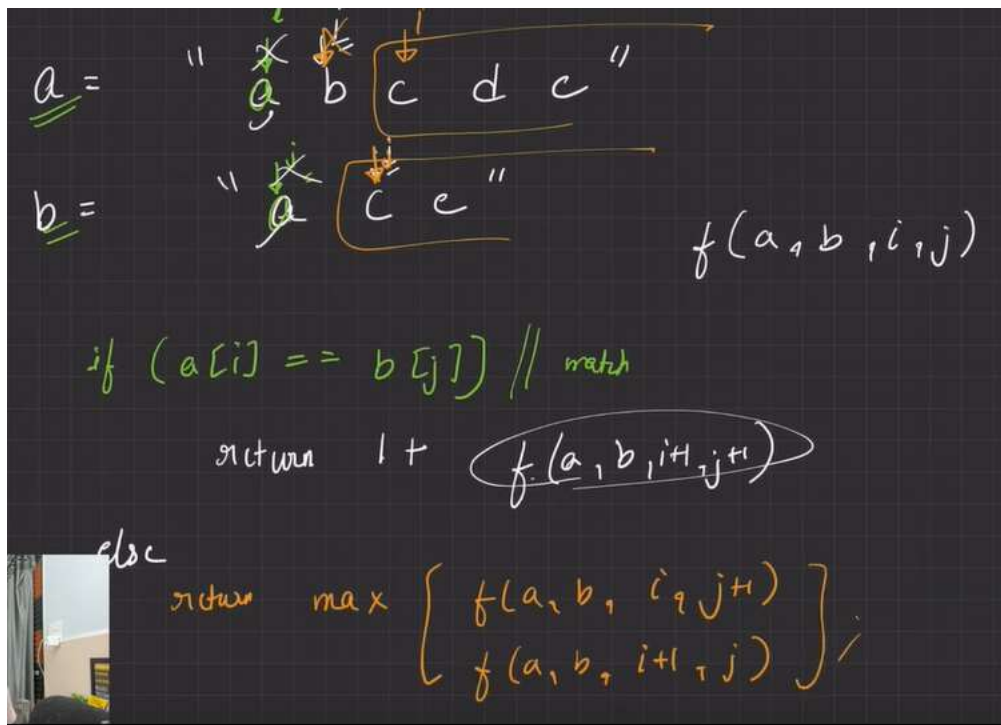
Another example:



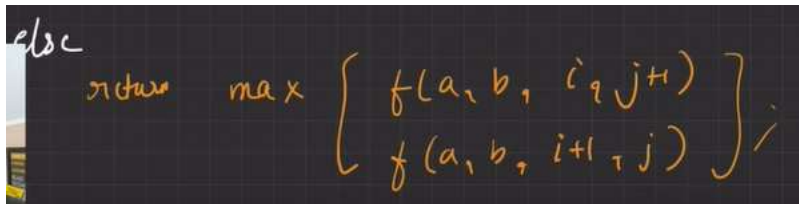
In below example, there is nothing common so ans = 0



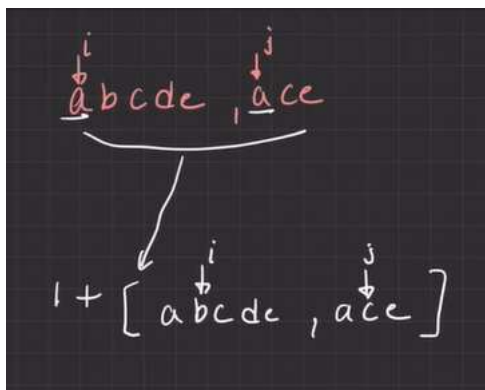
We will use recursion and put i and j in both string
 Is $arr1[i] == arr2[j]$ // match
 Return $1 + f(arr1, arr2, i+1, j+1)$



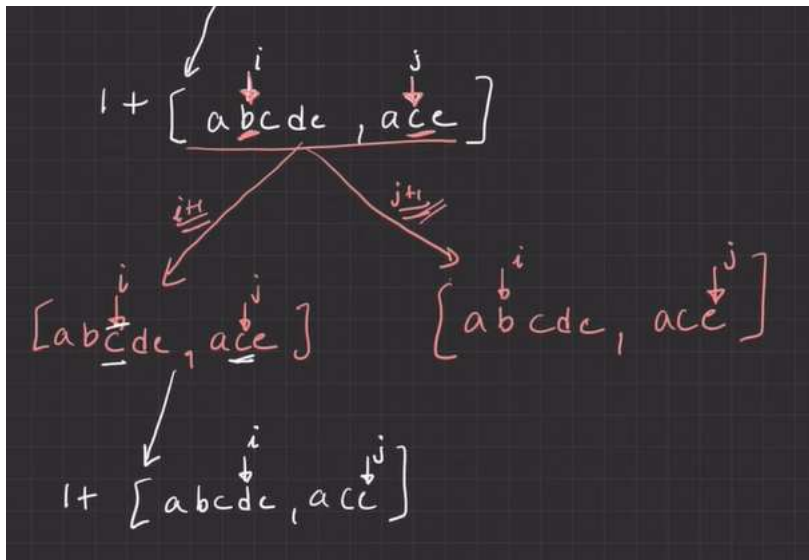
If they do not match we increase i first then we increase j. we take maximum of both



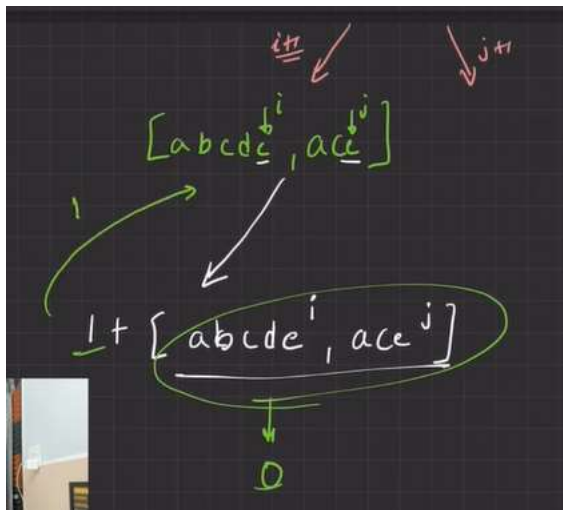
Working Tree



Next step



Once i and j reach out of array, we hit the base case, we return 0



Code: [gives TLE]

```
int solve(string s, string t, int i, int j)
{
    // base case
    if(i == s.length())
    {
        return 0;
    }
    if(j == t.length())
    {
        return 0;
    }
    // store ans
    int ans = 0;
    // if characters match move both pointer
    if(s[i]==t[j])
    {
        ans = 1 + solve(s,t,i+1,j+1);
    }
    else{
```



```

        // both do not match
        // ek baar i ko aage badhao, j ko rehene do
        // ek baar j ko aage badhao, i ko rehene do
        // get the maximum as result
        ans = max(solve(s,t,i+1,j), solve(s,t,i,j+1));
    }
    return ans;
}

```

```

int lcs(string s, string t)
{
    return solve(s,t,0,0);
}

```

Memoization (Top-down approach)

```

int solve(string s, string t, int i, int j, vector<vector<int>> &dp)
{
    // base case
    if(i == s.length())
    {
        return 0;
    }
    if(j == t.length())
    {
        return 0;
    }
    // if ans is already there in dp, do not make calls just return
the ans
    if(dp[i][j] != -1)
    {
        return dp[i][j];
    }
    // store ans
    int ans = 0;
    // if characters match move both pointer
    if(s[i]==t[j])
    {
        ans = 1 + solve(s,t,i+1,j+1,dp);
    }
    else{
        // both do not match
        // ek baar i ko aage badhao, j ko rehene do
        // ek baar j ko aage badhao, i ko rehene do
        // get the maximum as result
        ans = max(solve(s,t,i+1,j,dp), solve(s,t,i,j+1,dp));
    }
    return dp[i][j] = ans;
}

```

```

int lcs(string s, string t)
{
    // Memoization
    // we see i and j are changing so we need 2D dp
    vector<vector<int>> dp(s.length(), vector<int> (t.length(),-1));
    return solve(s,t,0,0,dp);
}

```

```
}
```

Bottom-up DP (Tabulation)

```
int solveTab(string s, string t, int n, int m)
{
    vector<vector<int>> dp(n+1, vector<int>(m+1,0));
    for(int i = n-1; i>=0; i--)
    {
        for(int j = m-1; j>= 0; j--)
        {
            int ans = 0;
            if(s[i]==t[j])
            {
                ans = 1 + dp[i+1][j+1];
            }
            else{
                ans = max(dp[i+1][j], dp[i][j+1]);
            }
            dp[i][j] = ans;
        }
    }
    return dp[0][0];
}

int lcs(string s, string t)
{
    // using tabulation
    int n = s.length();
    int m = t.length();
    return solveTab(s,t,n,m);
}
```

0/1 KnapSack Problem || learn 2-D DP Concept

A thief has a bag which can carry only 'W' weight, he has to theft some items such that the weight is maximum and within "W".

Example:

4 items Knapsack $\rightarrow W = 5$

$w \rightarrow$	1	2	4	5
$v \rightarrow$	5	4	8	6

$\{5\} \rightarrow \text{value} = 6$
 $\{1, 4\} \rightarrow 8+5 \rightarrow \text{value} = 13$
 $\{1, 2\} \rightarrow 5+4 \rightarrow \text{value} = 9$

First approach (Brute force)

We are taking combination of items, pick/not pick
Like taking an subset

$\{1, 2, 3, 4\} \rightarrow \{1\} \{2\} \{1, 2\} \{3\} \{1, 3\} \{2, 3\} \{4\} \{1, 4\} \{2, 4\} \{3, 4\} \{1, 2, 3\} \{1, 2, 4\} \{1, 3, 4\} \{2, 3, 4\} \{1, 2, 3, 4\}$

We take our combination of all weight/values and return maximum value out of it.
Let say we have 3 items A,B,C so I can have 8 combinations.

3 items

A, B, C

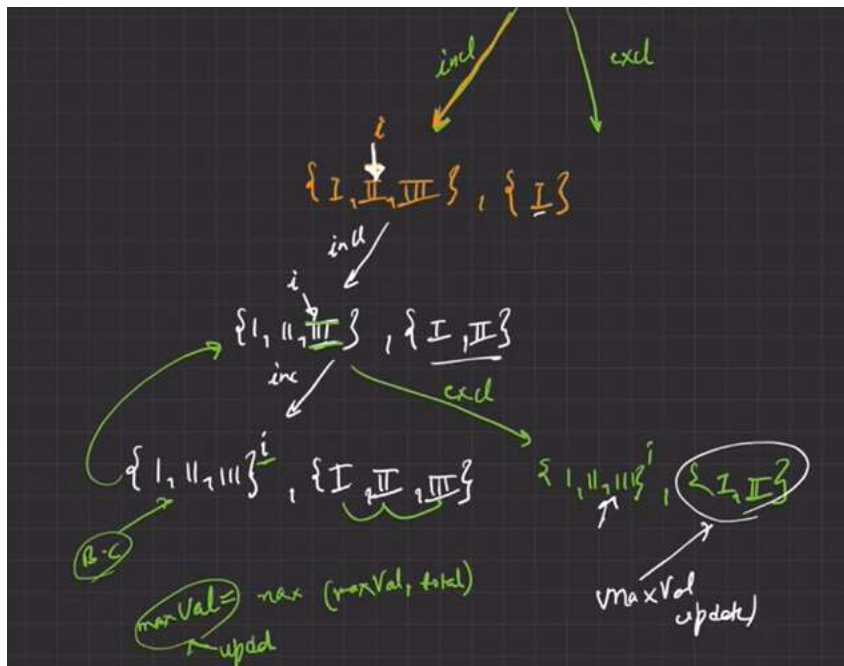
① $\{A\}$ ② $\{B\}$ ③ $\{A, B\}$
 ④ $\{C\}$ ⑤ $\{A, C\}$ ⑥ $\{B, C\}$
 ⑦ $\{A, B, C\}$ ⑧ $\{\}$

So we can use (include / not include) approach using recursion

We take a pointer and a DS

We include, we move pointer and include item in DS till Index does not go beyond `array.size()`

We take a variable `maxValue = INT_MIN` and we update it everytime base case reaches with DS size

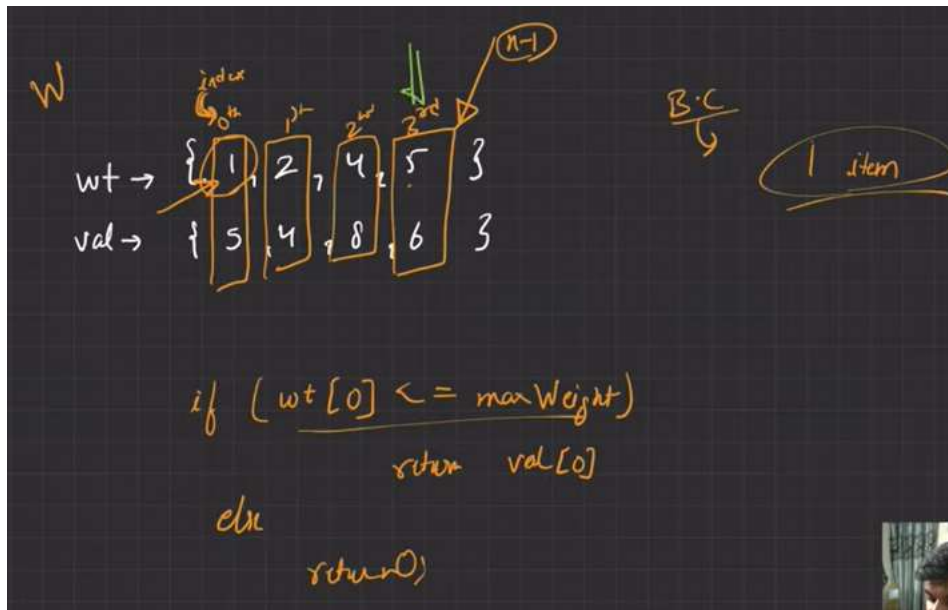


Code:

We will start from last index and do (include/ not include) thing

Base case becomes

If index==0, we check if weight is < maxWeight, we include it val[0] else we return 0



```
int solve(vector<int> &values, vector<int> &weights, int index, int capacity)
{
    // base case
    // if we have only one item left, whether we can include or not
    // depends on space we have left in our knapsack
    // we are starting from end of the array, means we are at the index = 0 when we have base case reached so
```

```

    if(index==0)
    {
        if(weights[0] <= capacity)
        {
            return values[0];
        }
        else{
            // we cannot include last element so return 0
            return 0;
        }
    }

    // now we either include a item or we exclude it
    // if we include weight[i] we do capacity - weight[i]
    // we + values[i] in our answer also
    int include = 0;
    // when can we include something?
    // if we can fit it in our knapsack
    if(weights[index] <= capacity)
    {
        // if included, move to next index means index-1 as we are going last -> first index
        include = values[index] + solve(values,weights,index-1,capacity - weights[index]);
    }
    // if excluded, capacity remains same
    // we move to next index that is index - 1 as we start from last index
    // we add 0 value in answer
    int exclude = 0 + solve(values,weights,index-1,capacity);
    // our ans will be the one maximum(include,exclude)
    int ans = max(include,exclude);
    return ans;
}

int maxProfit(vector<int> &values, vector<int> &weights, int n, int w)
{
    return solve(values,weights,n-1,w);
}

```

Memoisation

1. Create DP array and initialise it with -1
2. Store result of recursive call in DP array
3. Check in base case if answer is in DP array, no need of further calculation return from DP array

We create 2D DP because our 2 parameters are changing, index and capacity so we use index and capacity in 2D DP.

```

int solve(vector<int> &values,vector<int> &weights, int index, int capacity,vector<vector<int>> &dp)

```

```

{
    // base case
    // if we have only one item left, whether we can include or not
    depends on space we have left in our knapsack
    // we are starting from end of the array, means we are at the in
    dex = 0 when we have base case reached so
    if(index==0)
    {
        if(weights[0] <= capacity)
        {
            return values[0];
        }
        else{
            // we cannot include last element so return 0
            return 0;
        }
    }
    // check DP array for ans
    if(dp[index][capacity] != -1)
    {
        return dp[index][capacity];
    }

    // now we either include a item or we exclude it
    // if we include weight[i] we do capacity - weight[i]
    // we + values[i] in our answer also
    int include = 0;
    // when can we include something?
    // if we can fit it in our knapsack
    if(weights[index] <= capacity)
    {
        // if included, move to next index means index-1 as we are g
        oing last -> first index
        include = values[index] + solve(values,weights,index-1,capac
        ity - weights[index],dp);
    }
    // if excluded, capacity remains same
    // we move to next index that is index - 1 as we start from last
    index
    // we add 0 value in answer
    int exclude = 0 + solve(values,weights,index-1,capacity,dp);
    // our dp[index]
    [capacity] will be the one maximum(include,exclude)
    dp[index][capacity] = max(include,exclude);
    return dp[index][capacity];
}

int maxProfit(vector<int> &values, vector<int> &weights, int n, int
w)
{
    // creating 2D dp array of n rows and w+1 columns for index and
    capacity as these are only changing parameters
    vector<vector<int>> dp(n, vector<int> (w+1,-1));
    return solve(values,weights,n-1,w,dp);
}

```

Tabulation (Bottom-up DP)

1. Inside Tabulation, create your own DP array initialised with 0
2. Analyse base case

```
int solveTabulation(vector<int> &values, vector<int> &weights,int n,
int capacity)
{
    vector<vector<int>> dp(n, vector<int>(capacity+1,0));
    // we analyse the base case
    // base case runs for weight[0]
    for(int w = weights[0]; w<=capacity; w++)
    {
        if(weights[0] <= capacity)
        {
            dp[0][w] = values[0];
        }
        else{
            dp[0][w] = 0;
        }
    }
    // check other cases
    // our rows are of size = n
    // so our index will go from 0 to n-1, in base case we have done
    for 0th row, so we run ouer loop from i = 1 to i<n
    // our capacity will start from 0 to capacity so inner loop runs
    from 0 to <= capacity
    for(int index = 1; index<n; index++)
    {
        for(int w = 0; w<=capacity; w++)
        {
            int include = 0;
            if(weights[index] <= w)
            {
                include = values[index] + dp[index-1]
[w - weights[index]];
            }
            int exclude = 0 + dp[index-1][w];
            dp[index][w] = max(include,exclude);
        }
    }
    return dp[n-1][capacity];
}
```

```
int maxProfit(vector<int> &values, vector<int> &weights, int n, int
w)
{
    return solveTabulation(values,weights,n,w);
}
```

Edit Distance

Given two strings word1 and word2, return the minimum number of operations required to convert word1 to word2.

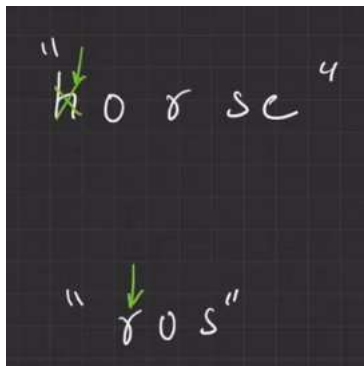
You have the following three operations permitted on a word:

1. Insert a character
2. Delete a character
3. Replace a character

Let say cost for performing each operation is 1

Let say we have 2 strings "horse" and "ros"

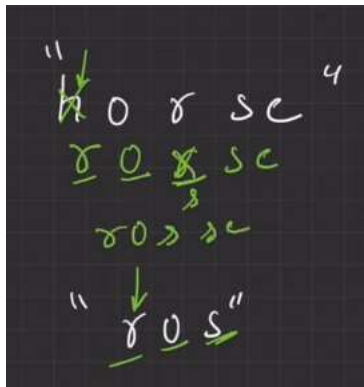
We compare first characters we replace 'h' with 'r'



We move to next 'o'

It matches

Now we go to next "r" of horse, not matching so make it "s"



Now ros are matched in both, delete 's' and 'e' from horse

So it took 4 operations replace,replace,delete,delete to convert horse to ros

There can be other ways also, return minimum number of operations

If(character matches) we call function for remaining string

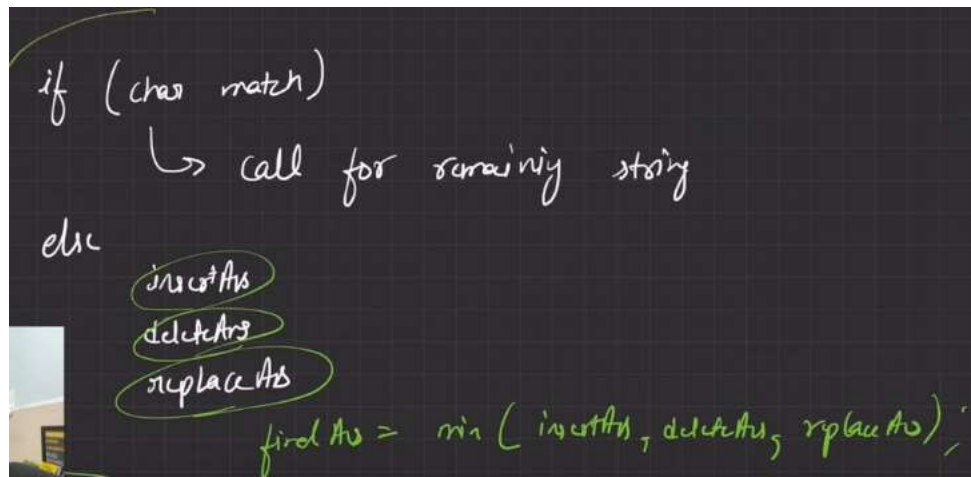
If they do not match

We insert and get an ansI

We delete and get an ansD

We replace and get an ansR

Our final answer is $\min(\text{ansI}, \text{ansD}, \text{ansR})$



Base case:

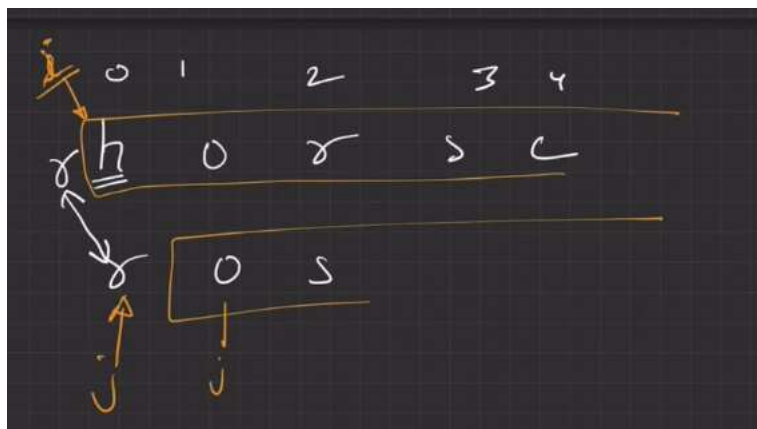
i is out of string 1 means string 1 is smaller than string 2

Then we return the number of characters by which string 2 is larger than string 1

That is $(\text{string2.length} - j)$

j is out of string 2 then return $(a.\text{length} - i)$

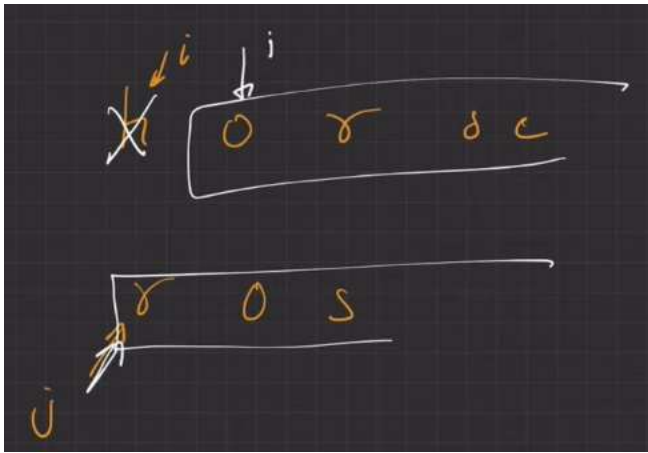
In our insert case, i will remain at its place as we are inserting $\text{string2}[j]$ in string1 so i remains as it is, j becomes $j + 1$



```
//insert  
int insertAns = solve(a, b, i, j+1);  
//delete
```

For Delete

i will move by 1 and j remains as it is



```
//delete
int deleteAns = solve(a, b, i+1, j);
```

For Replace

i,j both move by 1

```
//insert
int insertAns = 1 + solve(a, b, i, j+1);
//delete
int deleteAns = 1 + solve(a, b, i+1, j);
//replace
int replaceAns = 1 + solve(a, b, i+1, j+1);

ans = min(insertAns, min(deleteAns, replaceAns));
```

Code:

```
int distance(string s1, string s2, int i, int j)
{
    // base case
    if(i == s1.length())
    {
        // means s1 is smaller than s2
        // so return remaining elements of s2 as these many operations will be needed
        // to match s1 and s2 so return
        return s2.length() - j;
    }

    if(j == s2.length())
    {
        // means s2 smaller than s1
        // return remaining element of s1
        return s1.length() - i;
    }

    int ans = 0;

    // if both characters are equal, no operation needed just move to comparing next
```

indexes

```
    if(s1[i]==s2[j])
    {
        return distance(s1,s2,i+1,j+1);
    }
    else{
        // both not equal, we need to perform insert,delete,replace
        // insert
        // i remain as it is, j move by 1
        int insertAns = 1 + distance(s1,s2,i,j+1);

        // delete
        // j remains as it is, i move by 1
        int deleteAns = 1 + distance(s1,s2,i+1,j);

        // replace
        // j and i both move
        int replaceAns = 1 + distance(s1,s2,i+1,j+1);

        // store minimum of all in ans
        ans = min(insertAns, min(deleteAns, replaceAns));
    }

    return ans;
}
```

```
int minDistance(string word1, string word2) {
    return distance(word1,word2,0,0);
}
```

Memoization code

i and j are changing so we use 2D DP

```
int distance(string s1, string s2, int i,int j,vector<vector<int>> &
dp)
{
    // base case
    if(i== s1.length())
    {
        // means s1 is smaller than s2
        // so return remaining elements of s2 as these many oper
ations will be needed to match s1 and s2 so return
        return s2.length() - j;
    }

    if(j == s2.length())
    {
        // means s2 smaller than s1
        // return remaining element of s1
        return s1.length() - i;
    }

    // check dp
```

```

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

        int ans = 0;

        // if both characters are equal, no operation needed just move to comparing next indexes
        if(s1[i]==s2[j])
        {
            return distance(s1,s2,i+1,j+1,dp);
        }
        else{
            // both not equal, we need to perform insert,delete,replace
            // insert
            // i remain as it is, j move by 1
            int insertAns = 1 + distance(s1,s2,i,j+1,dp);

            // delete
            // j remains as it is, i move by 1
            int deleteAns = 1 + distance(s1,s2,i+1,j,dp);

            // replace
            // j and i both move
            int replaceAns = 1 + distance(s1,s2,i+1,j+1,dp);

            // store minimum of all in ans
            ans = min(insertAns, min(deleteAns, replaceAns));
        }

        return dp[i][j] = ans;
    }

    int editDistance(string word1, string word2) {
        vector<vector<int>> dp(word1.length(), vector<int> (word2.length(),-1));
        return distance(word1,word2,0,0,dp);
    }

```

Tabulation Approach (Bottom up approach)

```

int solveTabulation(string a, string b)
{
    // make dp array
    vector<vector<int>> dp(a.length()+1, vector<int> (b.length()+1,0));

    // convert the base cases
    for(int j = 0;j<b.length();j++)
    {
        // in a.length vali row fill
        dp[a.length()][j] = b.length() - j;
    }
}

```

```

for(int i = 0; i < a.length(); i++)
{
    // in b.length vali row fill
    dp[i][b.length()] = a.length() - i;
}

// now for other cases
// we go from bottom to up
for(int i = a.length()-1; i >= 0; i--)
{
    for(int j = b.length()-1; j >= 0; j--)
    {
        int ans = 0;
        // if both characters are equal, no operation needed
        just move to comparing next indexes
        if(a[i] == b[j])
        {
            ans = dp[i+1][j+1];
        }
        else{
            // both not equal, we need to perform insert, delete, replace

            // insert
            // i remain as it is, j move by 1
            int insertAns = 1 + dp[i][j+1];
            // delete
            // j remains as it is, i move by 1
            int deleteAns = 1 + dp[i+1][j];
            // replace
            // j and i both move
            int replaceAns = 1 + dp[i+1][j+1];
            // store minimum of all in ans
            ans = min(insertAns, min(deleteAns, replaceAns));
        }
        dp[i][j] = ans;
    }
}
return dp[0][0];
}

int editDistance(string word1, string word2) {
    return solveTabulation(word1, word2);
}

```

Maximum sum increasing subsequence (Prerequisite: LIS)

Given an array of n positive integers. Find the sum of the maximum sum subsequence of the given array such that the integers in the subsequence are sorted in strictly increasing order i.e. a strictly increasing subsequence.

Example 1:

Input: N = 5, arr[] = {1, 101, 2, 3, 100}

Output: 106

Explanation: The maximum sum of a increasing sequence is obtained from {1, 2, 3, 100}

LIS may not be MSIS (Maximum Sum increasing Subsequence)

We do not need longest increasing subsequence

We need maximum sum increasing subsequence

GIVEN: An array of numbers. $\begin{matrix} \text{a} & \text{b} \\ \uparrow & \uparrow \\ 1 & 2 \end{matrix}$ $1 < 2$

GOAL: Find max Sum increasing Subsequence (MSIS)

1, 3, 6 \rightarrow 10
1, 2, 6 \rightarrow 9
1, 100 \rightarrow 101

NOTE: LIS may not be MSIS.
Find increasing Subsequence with max Sum.

CONSTRAINTS

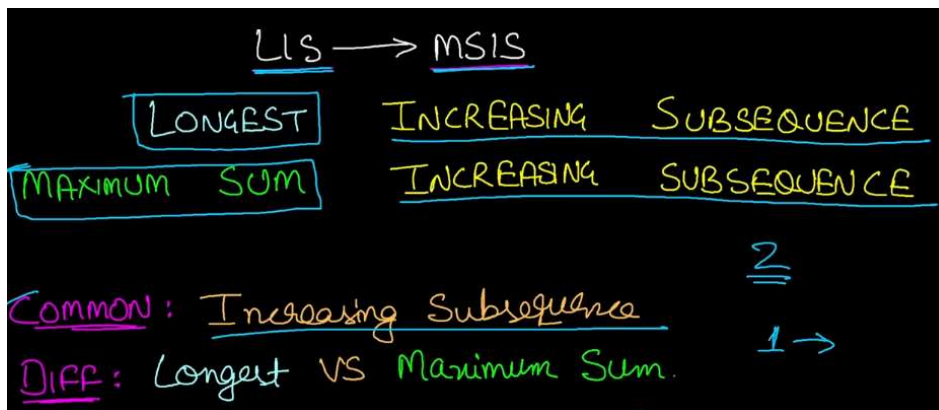
- 1) Subsequence must be increasing.
- 2) We need to take Subsequence with MAX SUM.

Naïve Approach gives TLE:

NAIVE: Find all increasing Subsequence Sums & take MAX of these Sums.

Optimised Approach

Here also we need an increasing subsequence



In LIS we keep track of longest length
 In MSIS, we will keep track of maximum sum

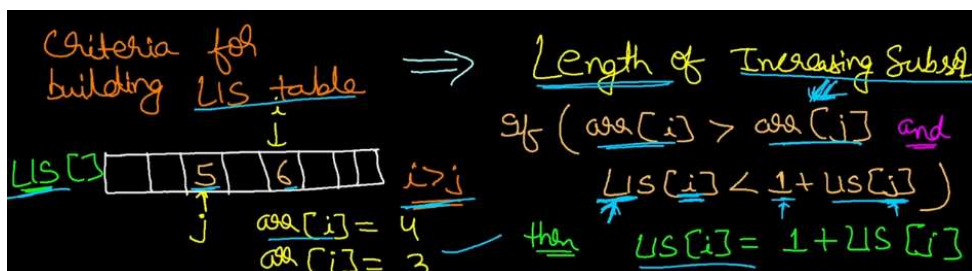
Criteria we followed for LIS:

Keeping in mind, i pointer is ahead j pointer

If $arr[i] > arr[j]$ means increasing sequence &&

$LIS[i] < 1 + LIS[j]$ means length is more than $LIS[j]$, then we have one more longest increasing subsequence so store it.

We are doing +1 above because including an element means adding one more element in the sequence



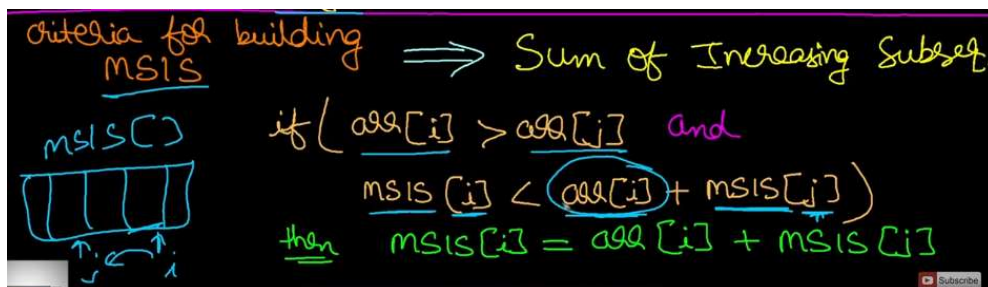
Criteria for MSIS:

Same for increasing sequence

We check for maximum sum also, $MSIS[i] < arr[i] + MSIS[j]$

Means we can store that sum, where i is current index.

Here we are doing + $arr[i]$ because including the element means adding its value inside maximum sum



TC: $O(n^2)$

Code:

```

int solve(vector<int> &arr, int n)
{
    int maxi = 0;
    int MSIS[n];

    for(int i = 0; i < n; i++)
    {
        // fill MSIS
        MSIS[i] = arr[i];
    }

    // Fill MSIS with maximum increasing subsequence sum for any index
    for(int i = 1; i < n; i++)
    {
        for(int j = 0; j < i; j++)
        {
            if(arr[i] > arr[j] && MSIS[i] < MSIS[j] + arr[i])
            {
                // for 0th index there is no one behind so arr[0] is
                // its max value
                // for other index we check from 0 till that index
                // if it is forming increasing subsequence which we
                // check by arr[i] > arr[j]
                // if MSIS has lower value, update it
                // we can update MSIS[i]
                MSIS[i] = arr[i] + MSIS[j];
            }
        }
    }

    // get max sum value
    for(int i = 0; i < n; i++)
    {
        if(maxi < MSIS[i])
        {
            maxi = MSIS[i];
        }
    }

    return maxi;
}

int maxIncreasingDumbbellsSum(vector<int> &arr, int n)
{
    return solve(arr, n);
}

```

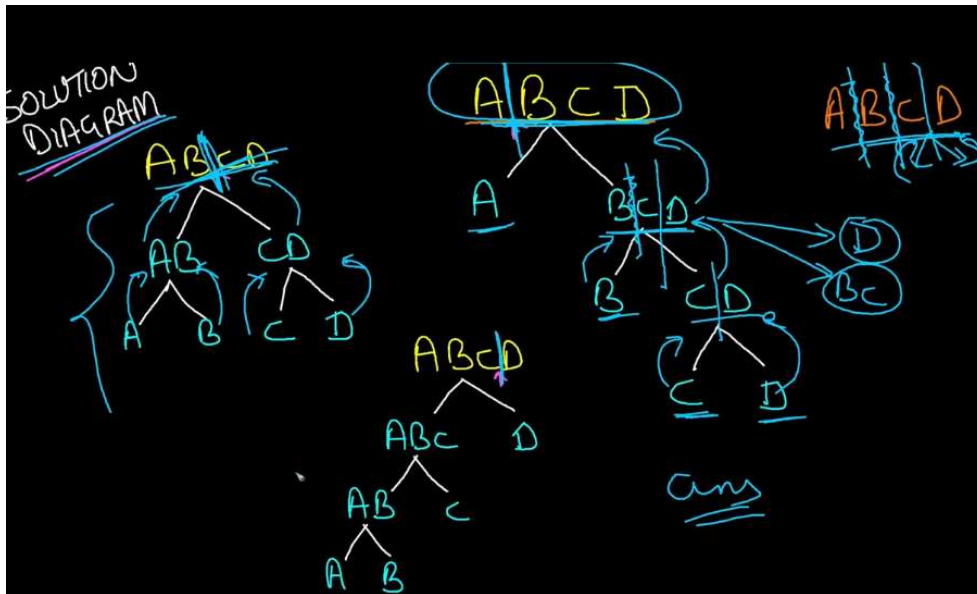
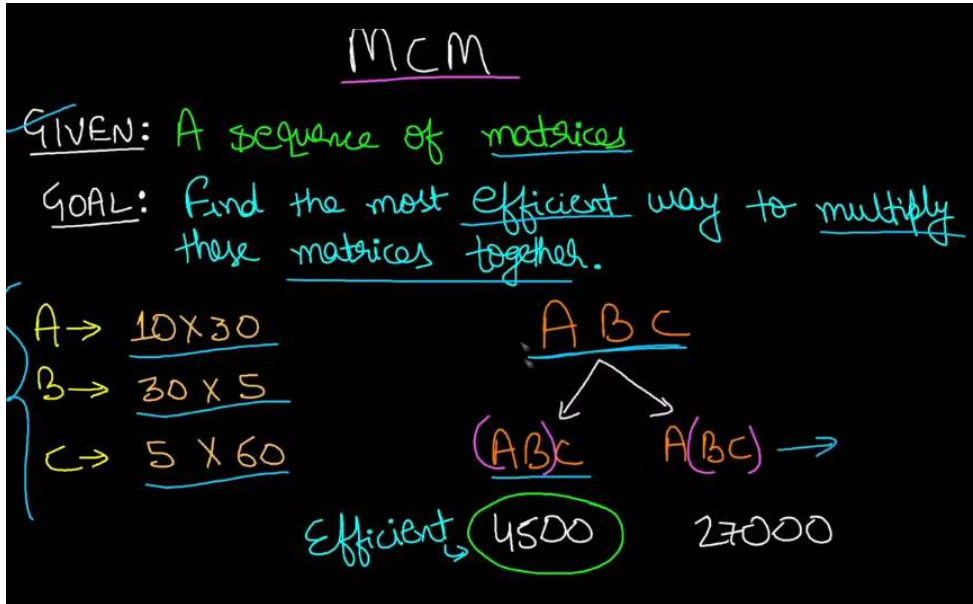
Matrix Chain Multiplication

Given a sequence of matrices, find the most efficient way to multiply these matrices together. The efficient way is the one that involves the least number of multiplications.

The dimensions of the matrices are given in an array **arr[]** of size **N** (such that **N** = number of matrices + 1) where the **ith** matrix has the dimensions (**arr[i-1] x**

arr[i]).

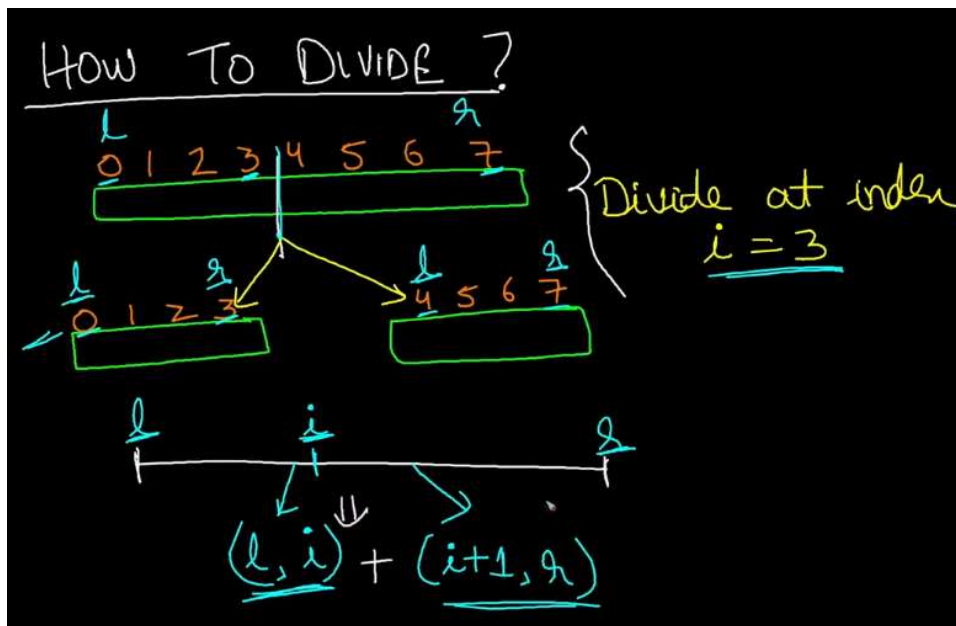
Approach to MCM Problems



For partitioning there must be a left limit and right limit between which our division will take place.

We can solve each partition using recursion and then we can use max/min according to our answer and consider the max/min answer while returning in recursion based on our problem statement

What is the idea behind division?



Code Format:

To solve the divided array we can use below code.

But, we need to do division from many parts to explore all the possibilities.

CODE FORMAT

```

int mcm (int arr[], int l, int r, int n)
{
    if (l < 0 || l >= n || r < 0 || r >= n) // Bounds check
        Return -1;
    int ans = INT_MAX;
    for (int i = l; i < r; ++i)
    {
        int left = mcm (arr, l, i, n);
        int right = mcm (arr, i+1, r, n);
        ans = min (left, right); // minimization problem
    }
    Return ans;
}

```

$O(N-1)$

left right

Actual Solution starts from here

In order to multiply 2 matrices, both matrices should have same number of columns.

MATRIX MULTIPLICATION

$$\begin{array}{c} P \\ \hline Q \end{array} \begin{array}{c} A \times B \\ \hline C \times D \end{array} \quad \left| \quad \begin{array}{c} P \times Q \text{ will only be possible} \\ \text{if } B=C \end{array}$$

$$\begin{array}{c} P \\ \hline Q \end{array} \begin{array}{c} A \times B \\ \hline C \times D \end{array} = \begin{array}{c} \text{Rows in } P \\ \text{cols in } Q \end{array} \begin{array}{c} S \\ \hline A \times C \end{array}$$

No. of multiplication operations = $A \times B \times C$

ex. $A_{10 \times 30} \times B_{30 \times 5} = S_{10 \times 5}$ (operations = $10 * 30 * 5$)

Multiplication is an Associative operation so in which order we multiply does not matter
 $(AB)C$ or $A(BC)$ will have same result but we need minimum number of operations to do this multiplication

In below example, we take 1500 operations to convert A and B to (AB)
 Now it takes 3000 operations more to convert $(AB)*(C)$ to ABC
 So total operations will be $3000 + 1500 = 4500$

GIVEN: Sequence of matrices (with dimension)

GOAL: Find most efficient way to multiply matrices

ex.

$$\begin{array}{l} A \rightarrow 10 \times 30 \\ B \rightarrow 30 \times 5 \\ C \rightarrow 5 \times 60 \end{array}$$

$$\begin{array}{l} AB \rightarrow 10 \times 5 \quad (\text{operations} = 10 * 30 * 5 = 1500) \\ BC \rightarrow 30 \times 60 \quad (\text{operations} = 30 * 5 * 60 = 9000) \end{array}$$

$$(AB)_{10 \times 5} * C_{5 \times 60} = ABC_{10 \times 60} \quad (\text{operations} = 3000)$$

$\therefore \text{TOTAL} = 4500$

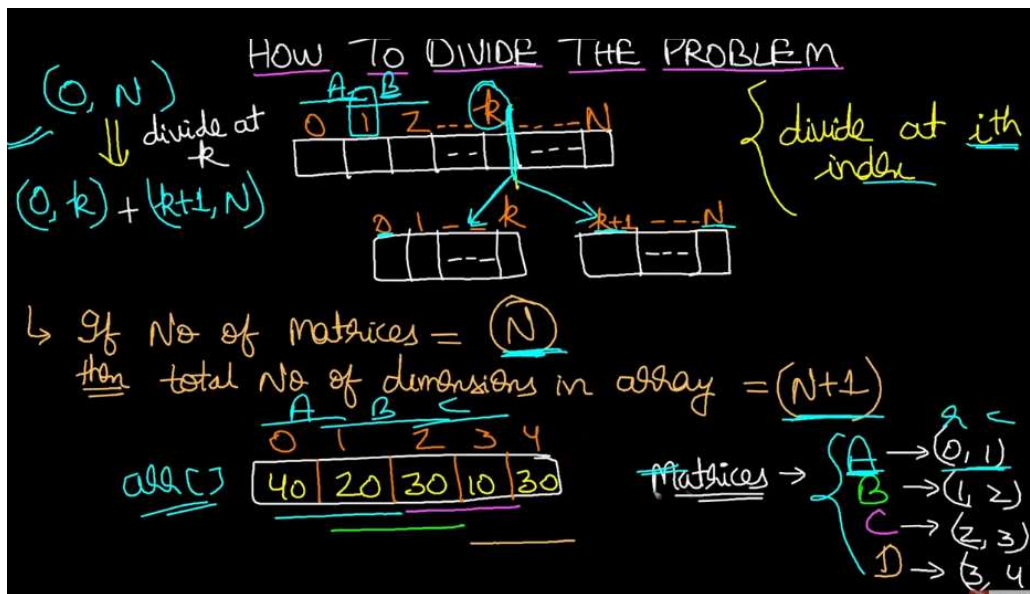
Now if we do $(BC) * A$, we take 27000 operations so this way is not optimised.

Approach

Current Cost = Cost of current matrix element [ith matrix]

Total Cost = Current cost + other cost (coming from recursion)

For a single matrix Current cost and Total cost both are = 0

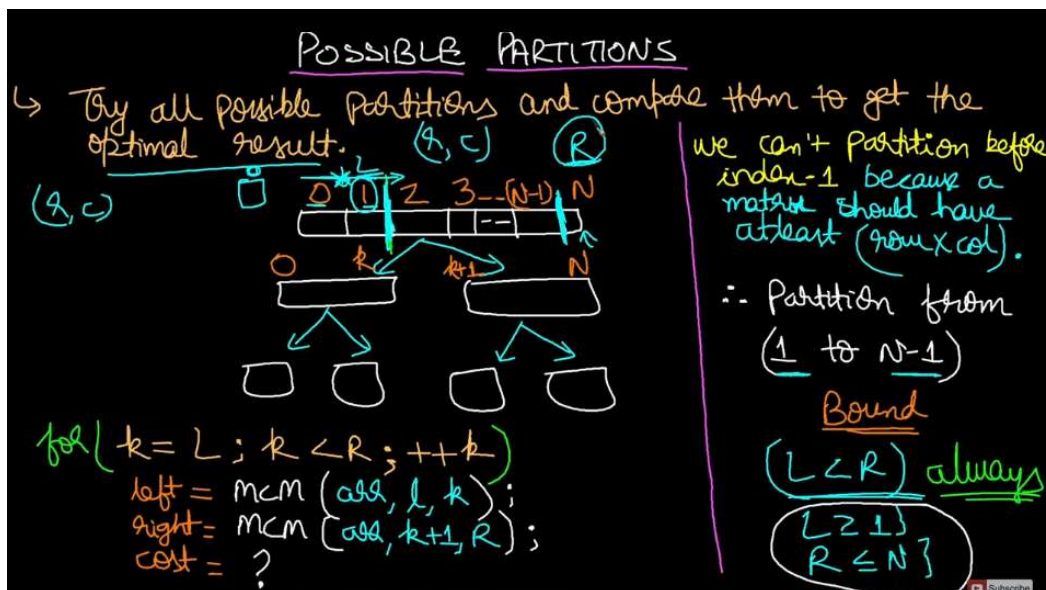


To do partition we need atleast one row and one column

So we cannot partition in index = 0 and 1 we need to partition after index = 1

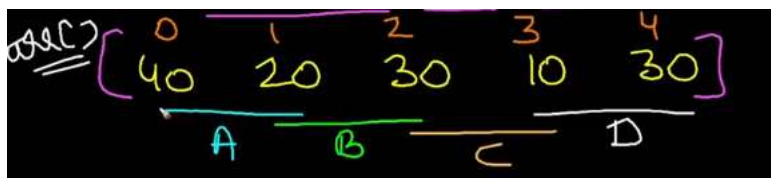
And we cannot partition after index = N so we need to partition between index = 2 to N

Keeping in mind, $L < \text{right}$ and $L \geq 1$ and $R \leq N$



In our problem statement, our array contains the matrix values where $\text{arr}[i-1]$ is row of i^{th} matrix and $\text{arr}[i]$ is column of i^{th} matrix

A, B, C, D, are our 4 matrices. Whose dimensions are shown at indexes



Our matrices are like:

$$\begin{array}{l} A_{40 \times 20} \\ B_{20 \times 30} \\ C_{30 \times 10} \\ D_{10 \times 30} \end{array}$$

We can only multiply 2 matrices if their column number is same.

For ABC, we check number of column of AB and number of column of C, if they are same. Then, ABC has number of rows = number of rows of AB and number of column = number of column of C

$$\begin{array}{l} \text{then} \\ \underline{AB}_{40 \times 30} \\ \underline{BC}_{20 \times 10} \\ ABC_{40 \times 10} \\ \text{or} \quad ABCD_{40 \times 30} \end{array}$$

NOTE: Order of multiplication doesn't matter while finding dimension of resultant matrix.

So, Dimensions of left partition result will be $arr[L-1] \times arr[K]$

Dimensions of right partition result will be $arr[K] \times arr[R]$

$$\begin{array}{c} \text{arr} = \begin{bmatrix} 0 & 1 & 2 & 3 & 4 \\ 40 & 20 & 30 & 10 & 30 \end{bmatrix} \\ \begin{array}{ccccc} & A & B & C & D \\ \hline \end{array} \end{array}$$

left 40×30 $AB_{40 \times 30}$
 Right 30×30 $(CD)_{30 \times 30}$
 left $arr[L-1] \times arr[K]$
 Right $arr[K] \times arr[R]$

Resultans Answer will have dimension $arr[L-1] \times arr[R]$

$$\left\{ \begin{array}{l} \text{Left } \text{arr}[L-1] \times \text{arr}[k] \\ \text{Right } \text{arr}[k] \times \text{arr}[R] \end{array} \right\} \rightarrow \text{Ans } \text{arr}[L-1] \times \text{arr}[R]$$

Cost will be:

$$\text{Cost} = \underbrace{\text{arr}[L-1]}_{\substack{\uparrow \\ \text{Rows in left} \\ \text{matrix}}} * \underbrace{\text{arr}[k]}_{\substack{\uparrow \\ \text{cols in left} \\ \text{or rows in} \\ \text{right}}} * \underbrace{\text{arr}[R]}_{\substack{\uparrow \\ \text{cols in} \\ \text{right} \\ \text{matrix}}};$$

Pseudo-Code:

$\left[\overset{0}{\textcircled{40}} \quad \overset{1}{\textcircled{20}} \quad \overset{2}{\textcircled{30}} \quad \overset{3}{\textcircled{10}} \quad \overset{4}{\textcircled{30}} \right]$
} 4 matrices A, B, C, D

$\text{For } P_1: \text{cost} = \underbrace{A}_{40 \times 20} * \underbrace{BCD}_{20 \times 30} = 40 * 20 * 30$

$\text{For } P_2: \text{cost} = \underbrace{AB}_{40 \times 30} * \underbrace{CD}_{30 \times 30} = 40 * 30 * 30$

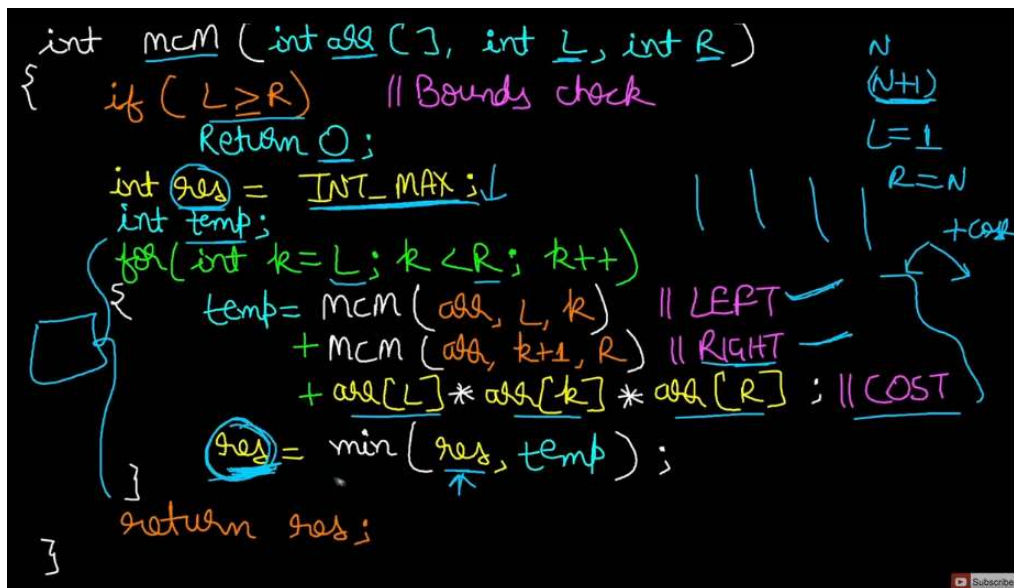
Generalized :-

$\text{for } (\text{int } k = L; k < R; k++)$

$\text{Cost} = \underbrace{\text{arr}[L-1]}_{\substack{\uparrow \\ \text{Rows in left} \\ \text{matrix}}} * \underbrace{\text{arr}[k]}_{\substack{\uparrow \\ \text{cols in left} \\ \text{or rows in} \\ \text{right}}} * \underbrace{\text{arr}[R]}_{\substack{\uparrow \\ \text{cols in} \\ \text{right} \\ \text{matrix}}};$

Code:

L = 1, R = N initially



Code (Recursive) (gives TLE):

```

int solve(int N, int arr[], int left, int right)
{
    if(left >= right)
    {
        return 0;
    }

    int res = INT_MAX;
    int temp = 0;

    for(int k = left; k <= right-1; k++)
    {
        temp = solve(N, arr, left, k) + solve(N, arr, k+
1, right) + (arr[left-1]*arr[k]*arr[right]);
        res = min(res, temp);
    }

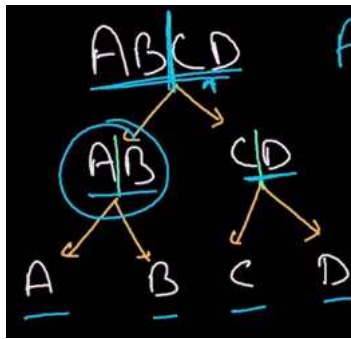
    return res;
}

int matrixMultiplication(int N, int arr[])
{
    return solve(N, arr, 1, N-1);
}

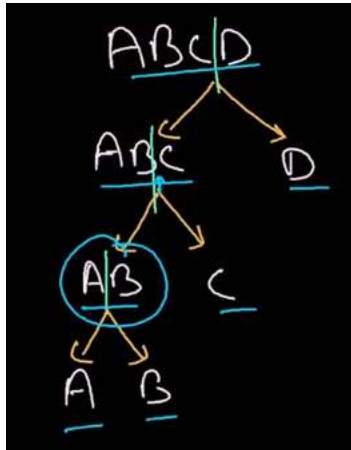
```

Code (Memoised)

If we partition from AB|CD



If we partition from ABC | D



We see, in both case **there are many overlapping subproblems**

In actual answer, we partition from all points

A | B | C | D

And try to get minimum answer and return it.

We can take an 2D vector of size $[n][n]$

Memoized Code

```

int mcm ( int arr, int l, int r)
{
    if ( l >= r ) return 0; // Bound check
    if ( mcm[l][r] != -1 ) return mcm[l][r];
    int ans = INT_MAX;
    for ( int k = l; k < r; ++k )
    {
        int left = mcm ( arr, l, k );
        int right = mcm ( arr, k+1, r );
        int cost = arr[l-1] * arr[k] * arr[r];
        ans = min ( ans, left + right + cost );
    }
    return mcm[l][r] = ans;
}

```

Handwritten notes on the code:
 - A box containing ≥ 0 is next to the base case.
 - A box containing -1 is next to the memoization check.
 - A box containing l and r is next to the function signature.
 - A box containing ans is next to the final return statement.

```

int solve(int N, vector<int> arr, int left, int right, vector<vector<int>> &dp)

```

```

{
    if(left>=right)
    {
        return 0;
    }

    if(dp[left][right] != -1)
    {
        return dp[left][right];
    }

    int res = INT_MAX;
    int temp = 0;

    for(int k = left; k<=right-1; k++)
    {
        temp = solve(N,arr,left,k,dp) + solve(N,arr,k+
1,right,dp) + (arr[left-1]*arr[k]*arr[right]);
        res = min(res,temp);
    }

    return dp[left][right] = res;
}

int matrixMultiplication(vector<int> &arr, int N)
{
    vector<vector<int>> dp(N, vector<int> (N,-1));
    return solve(N,arr,1,N-1,dp);
}

```

Minimum Path Sum

Given a $n \times m$ grid filled with non-negative numbers, find a path from top left to bottom right, which minimizes the sum of all numbers along its path.

Note: You can **only move either down or right** at any point in time.

Example 1:

1	3	1
1	5	1
4	2	1

Input: grid = [[1,3,1],[1,5,1],[4,2,1]]

Output: 7

Explanation: Because the path 1 → 3 → 1 → 1 → 1 minimizes the sum.

Approach

2x3 grid with values: 5, 9, 6 (row 0) and 11, 5, 2 (row 1).
Path (0,0) → (0,2) sum = 5 + 11 + 5 + 2 = 23
Path (0,0) → (1,2) sum = 5 + 9 + 5 + 2 = 21 (Minimum)

Why can't we follow Greedy?

In below Grid greedy would follow this path

10	8	2
10	5	100
1	1	1

Whereas there are other paths also which are less expensive, so we cannot use Greedy
Values are not uniform, they are not only increasing or only decreasing
When there is no uniformity we should not apply greedy

Tell me all paths, return the one with minimum sum
Steps to write a recurrence relation

- Our recursion should give us minimum cost to reach $(0,0) \rightarrow (i,j)$
We will start from $f(n-1, m-1)$

If we reach out of bound, we return INT_MAX as we need minimum value and if there is any out of bound index, we do not need to take it.

Now we go up or left

Take minimal of both of them.

Our Pseudocode looks like:

```

f(i, j)
{
  if (i == 0 && j == 0) return a[0][0];
  if (i < 0 || j < 0) return INT_MAX;

  up = a[i][j] + f(i-1, j);
  left = a[i][j] + f(i, j-1);

  return min(up, left);
}

```

There will be some Overlapping sub-problems
 So we need to apply **Memoization**

Declare a dp of $[n-1][m-1]$ with initialised by -1

```

f(i, j)
{
  if (i == 0 && j == 0) return a[0][0];
  if (i < 0 || j < 0) return INT_MAX;
  if (dp[i][j] != -1) return dp[i][j];

  up = a[i][j] + f(i-1, j);
  left = a[i][j] + f(i, j-1);

  return dp[i][j] = min(up, left);
}

```

```

TC  $\rightarrow O(N \times M)$ 
SC  $\rightarrow O(W \times H) +$ 
     $O(\text{path length})$ 
     $(m-1) + (n-1)$ 

```

Tabulation

We have 2 changing variables i and j

i goes from 0 to n-1

j goes from 0 to m-1

We take dp[n][m]

```
dp[n][m];
for (i = 0 → n-1)
{
    for (j = 0 → m-1)
    {
        if (i == 0 & j == 0) dp[i][j] = a[0][0];
        else
        {
            up = dp[i-1][j];
            left = dp[i][j-1];
            dp[i][j] = min(up, left);
        }
    }
}
```

```
for (j = 0 → m-1)
{
    if (i == 0 & j == 0) dp[i][j] = a[0][0];
    else
    {
        if (i > 0) up = dp[i-1][j];
        if (j > 0) left = dp[i][j-1];
        dp[i][j] = min(up, left);
    }
}
```

```
else
{
    up = dp[i-1][j];
    left = dp[i][j-1];
    dp[i][j] = min(up, left);
}
}
```

At the end we return

Recursion Code

```
int solve(vector<vector<int>> &grid, int i, int j)
{
    if(i==0 && j==0) return grid[i][j];
    if(i<0 || j<0) return 1e9; // we do not need to take this value
    so we return INT_MAX as min(left,up) will ignore INT_MAX automatical
    ly
    int up = grid[i][j] + solve(grid,i-1,j);
    int left = grid[i][j] + solve(grid,i,j-1);
    return min(left,up);
}

int minSumPath(vector<vector<int>> &grid) {
    int n = grid.size();
    int m = grid[0].size();
    return solve(grid,n-1,m-1);
}
```

Memo Code

```
int solve(vector<vector<int>> &grid, int i, int j,vector<vector<int>>
> &dp)
{
    if(i==0 && j==0) return grid[i][j];
    if(i<0 || j<0) return 1e9; // we do not need to take this value
    so we return INT_MAX as min(left,up) will ignore INT_MAX automatical
    ly
    if(dp[i][j] != -1) return dp[i][j];
    int up = grid[i][j] + solve(grid,i-1,j,dp);
    int left = grid[i][j] + solve(grid,i,j-1,dp);
    return dp[i][j] = min(left,up);
}

int minSumPath(vector<vector<int>> &grid) {
    int n = grid.size();
    int m = grid[0].size();
    vector<vector<int>> dp(n, vector<int>(m,-1));
    return solve(grid,n-1,m-1,dp);
}
```

Tabulation Code

```
int Tabulation(vector<vector<int>> &grid, int n, int m)
{
    vector<vector<int>> dp(n, vector<int>(m,0));

    for(int i = 0;i<n;i++)
    {
```

```

        for(int j = 0; j < m; j++)
        {
            if(i==0 && j==0) dp[i][j] = grid[0][0];
            else{
                int up = grid[i][j];
                if(i>0)
                {
                    up = grid[i][j] + dp[i-1][j];
                }
                else{
                    up += 1e9;
                }

                int left = grid[i][j];

                if(j>0)
                {
                    left += dp[i][j-1];
                }
                else{
                    left += 1e9;
                }

                dp[i][j] = min(up, left);
            }
        }
    }

    return dp[n-1][m-1];
}

int minSumPath(vector<vector<int>> &grid) {
    int n = grid.size();
    int m = grid[0].size();
    return Tabulation(grid, n, m);
}

```

Coin Change

You are given an integer array `coins` representing coins of different denominations and an integer amount representing a total amount of money.

Return *the fewest number of coins that you need to make up that amount*. If that amount of money cannot be made up by any combination of the coins, return -1.

You may assume that you have an infinite number of each kind of coin.

Example 1:

Input: `coins = [1,2,5]`, `amount = 11`

Output: 3

Explanation: $11 = 5 + 5 + 1$

Example 2:

Input: `coins = [2]`, `amount = 3`

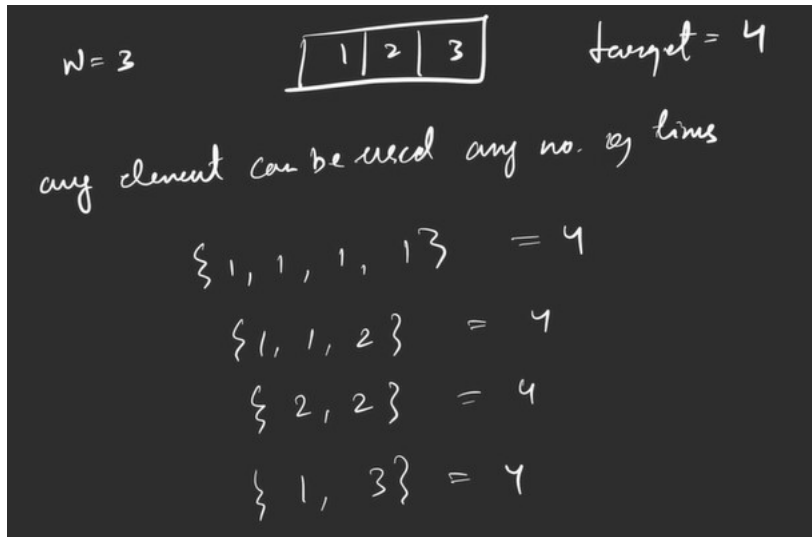
Output: -1

Example 3:

Input: `coins = [1]`, `amount = 0`

Output: 0

We can take any number of coins any number of times



We try all ways and return the minimum answer

In total number of ways questions

In base case, we return 1 if destination is reached, we return 0 if destination is not reached

Otherwise we make function call 1

Function call 2

Return call 1 + call 2;

1. Express in term of index, target
2. Explore all possibilities
3. Sum all possibility and return

$F(\text{index}, \text{target})$ means till index = index, how many number of ways are there to make the target = target

Either we can take a element
Or we do not take a element

When we take it, we do target - element and **we do not move to index -1 because we can pick same element any number of time so we remain stand at that index** and if(element < target) then only we can take it.

When we do not take it, we do not change the target and move index - 1

Base case

If we start recursion from last index, we move from $n-1 \rightarrow 0$

Say if we have {3} as element and 4 as target, will we be able to make target from element?

No

If element = {2} and target = 4 then?

Yes {2,2} = 4

If element = {1} and target = 4 then?

Yes {1,1,1,1} = 4

So if (Target % (element) == 0) then we can make target from element? Yes

So in base case we will reach index = 0, and if we can use arr[0] for target or not, we see it by doing

```
f(ind, T)
{
    if (ind == 0)
    {
        return (T % a[0] == 0)
    }
    return f(ind-1, T);
}
```

So if it can be included, it return 1, else it return 0

Our **Recursion code** looks like:

```
f(ind, T)
{
    if (ind == 0)
    {
        return (T % a[0] == 0);
    }
    notTake = f(ind-1, T);
    take = 0;
    if (arr[ind] <= T) take = f(ind, T - arr[ind]);
    return notTake + take;
}
```

Complexity:

Recursion \rightarrow $TC \rightarrow$ (exponential)
 $SL \rightarrow >> O(N)$
 $O(\text{Target})$

Memo Code

We will have overlapping sub-problems

We will use 2D array for (index, target) as these both are changing.

```

f(ind, T)
{
    if (ind == 0)
    {
        return (T % a[0] == 0);
    }
    notTake = f(ind-1, T);
    take = 0;
    if (arr[ind] <= T) take = f(ind, T - arr[ind]);
    return notTake + take;
}
    
```

Handwritten notes in the image:

- Annotations above the code: \uparrow 1, \uparrow 0
- A green arrow points from `return (T % a[0] == 0);` to `if (dp[T] != -1)`.
- The `ind` parameter in the recursive call `f(ind, T - arr[ind])` is circled in green.
- `dp[ind][T]` is written in green above the `return` statement.

$TC \rightarrow O(N \times T)$
 $SL \rightarrow O(N \times T)$
 $+ O(\text{target})$

Tabulation code (Bottom up approach)

Steps to write Tabulation

1. Base case
2. Check index, T range
3. Copy the Recurrence

Base case only execute at index = 0

We take `dp[N][T]`

$$dp[n][T]$$

for ($T \rightarrow 0 \rightarrow \text{target}$)

$$dp[0][T] = (T \% \text{deno}[0] == 0)$$

Index goes from $n-1 \rightarrow 0$ in our recurrence

For tabulation it will go from $1 \rightarrow n-1$ as for index = 0 we have already written the base case

Target move from $0 \rightarrow T$

Recursion Code

```
long solve(int *deno, int index, int T)
{
    if(index==0)
    {
        return T % deno[0] == 0;
    }
    int notTake = solve(deno, index-1, T);
    int take = 0;
    if(deno[index] <= T)
    {
        take = solve(deno, index, T - deno[index]);
    }
    return take + notTake;
}
```

```
long countWaysToMakeChange(int *denominations, int n, int value)
{
    return solve(denominations, n-1, value);
}
```

Memo Code

```
long solve(int *deno, int index, int T, vector<vector<int>> &dp)
{
    if(index==0)
    {
        return T % deno[0] == 0;
    }
    if(dp[index][T] != -1)
    {
        return dp[index][T];
    }
    long notTake = solve(deno, index-1, T, dp);
    long take = 0;
    if(deno[index] <= T)
```

```

    {
        take = solve(deno,index,T - deno[index],dp);
    }
    return dp[index][T] = take + notTake;
}

long countWaysToMakeChange(int *denominations, int n, int value)
{
    vector<vector<long>> dp(n, vector<long> (value+1,-1));
    return solve(denominations,n-1,value,dp);
}

```

Tabulation Code

```

long Tabulation(int *deno, int value, int n)
{
    vector<vector<long>> dp(n, vector<long> (value+1,0));
    for(int T = 0; T<=value; T++)
    {
        dp[0][T] = (T % deno[0] == 0);
    }
    for(int index = 1; index < n; index++)
    {
        for(int T = 0; T<=value; T++)
        {
            long notTake = dp[index-1][T];
            long take = 0;
            if(deno[index] <= T)
            {
                take = dp[index][T - deno[index]];
            }
            dp[index][T] = take + notTake;
        }
    }
    return dp[n-1][value];
}

long countWaysToMakeChange(int *denominations, int n, int value)
{
    return Tabulation(denominations,value,n);
}

```

Subset Sum Equal To K

You are given an array/list 'ARR' of 'N' positive integers and an integer 'K'. Your task is to check if there exists a subset in 'ARR' with a sum equal to 'K'.

Note: Return true if there exists a subset with sum equal to 'K'. Otherwise, return false.

For Example :

If 'ARR' is {1,2,3,4} and 'K' = 4, then there exists 2 subsets with sum = 4. These are {1,3} and {4}. Hence, return true.

DP on Subsequences/ Subsets

Any contiguous / non-contiguous part of array is called as subsequence/ subset

Subsets need not to be in a sequence

Brute force

Generate all subsequences & check if any of them gives sum of K
But we just need any one subset and return true

1. Express everything in term of index, target
2. Explore possibilities of that index, possibilities can be A[ind] is part of subsequence or its not part of subsequence
3. Return true / false

We start from index = n-1

F(n-1, target) means In the array till index = n-1, Is there exists a target = target?

What are the base cases?

We might have achieved the target, our target has become zero.

We might have reached index = 0 and we have a target = T left to achieve. Now Can we achieve target T using element at index = 0.

If Arr[0] = target then only we can achieve that T target using index = 0

```
f(ind, target)
{
    if (target == 0) return true;
    if (ind == 0) return (arr[0] == target);
```

Explore all possibilities now

We either take element or not take it

Bool Not-take = we move index - 1 and target remains same

bool take = false;

We can only take an element if(element <= target)

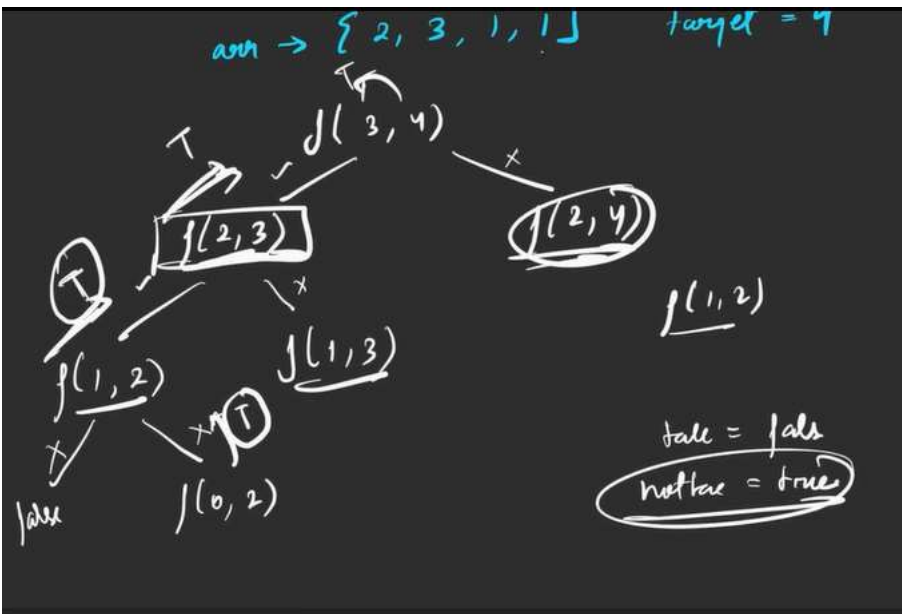
Take = we move index - 1 and target = target - arr[index]

```
bool not false = f(ind-1, target);  
bool false = false;  
if (target >= a[ind])  
    false = f(ind-1, target - a[ind]);
```

Now we are looking for possibilities so it take gives us answer, we are OK
If not-take gives us the answer, we are still OK
So return take || not-take

- subm (false) or (not false);

Recursion Tree



We see we have some over-lapping subproblems

Recursion TC:

$$\begin{aligned} TC &\rightarrow \underline{O(2^n)} \\ SC &\rightarrow O(n) \end{aligned}$$

Memo Approach

Changing terms are index and target

Let say our constraints say our index and target are lesser than 10^3

$$\text{ind} \leq 10^3 \quad (\text{target} \leq 10^3)$$

Then we need 2D Dp of type int of size $10^3 + 1$

$$\text{dp} \begin{matrix} \text{ind} & \text{target} \\ \hline \hline \end{matrix} \{10^3+1\} \times \{10^3+1\}$$

Complexity

$$\begin{aligned} \text{TC} &\rightarrow O(N \times \text{target}) \\ \text{SC} &\rightarrow O(N \times \text{target}) + O(N) \end{aligned}$$

We see we use $O(n)$ as Auxiliary Space, To reduce this space we use Tabulation

Tabulation (Bottom up) bottom up does not means write from last stage to first stage, it means write ulta of whatever was the base case in recurrence

1. Declare DP array of same size
2. See base cases in recurrence and think of indexes it can work upon

$$\begin{aligned} \text{for } (i = 0 \rightarrow n-1) \quad \text{dp}[i][0] &= \text{true}; \\ \text{dp}[0][a[0]] &= \text{true} \end{aligned}$$

3. Form the nexted loops (the number of states = number of nested loops), we have 2 states index and target

In recurrence we went from index = $n-1$ to 0, target = target $\rightarrow 0$

In tabulation we go ulta so

Index is 1 to $n-1$ as we have already covered index = 0 in base case

Target is 1 to value, 0 is already covered in base case

Handwritten recurrence relation on a blackboard:

$$\text{fun } (i = 1 \rightarrow n-1) \{$$

$$\text{fun } (\text{target} = 1 \rightarrow k) \{$$

4. Copy paste the recurrence relation and store it in DP, at the end return `dp[n-1][k]`

Complexity

Handwritten complexity analysis:

$$TC \rightarrow O(N \times \text{target})$$

$$SC \rightarrow O(N \times \text{target})$$

Recursion Code

```
bool solve(int index, int target, vector<int> arr)
{
    if(target==0) return true;
    if(index==0) return arr[0]==target;
    bool notTake = solve(index-1,target,arr);
    bool take = false;
    if(target >= arr[index])
    {
        take = solve(index-1,target - arr[index] ,arr);
    }
    return take | notTake;
}

bool subsetSumToK(int n, int k, vector<int> &arr) {
    return solve(n-1,k,arr);
}
```

Memo Code

```
bool solve(int index, int target, vector<int> arr,vector<vector<int>
> &dp)
{
    if(target==0) return true;
    if(index==0) return arr[0]==target;
    if(dp[index][target] != -1)
    {
        return dp[index][target];
    }
    bool notTake = solve(index-1,target,arr,dp);
```

```

    bool take = false;
    if(target >= arr[index])
    {
        take = solve(index-1,target - arr[index] ,arr,dp);
    }
    return dp[index][target] = take | notTake;
}

bool subsetSumToK(int n, int k, vector<int> &arr) {
    vector<vector<int>> dp(n, vector<int> (k+1,-1));
    return solve(n-1,k,arr,dp);
}

```

Tabulation Code

```

bool Tabulation(int n, int k, vector<int> arr)
{
    vector<vector<bool>> dp(n, vector<bool> (k+1,0));
    for(int index = 0; index<n; index++)
    {
        dp[index][0] = true;
    }
    dp[0][arr[0]] = true;
    for(int index = 1;index < n;index++)
    {
        for(int target = 1;target <= k; target++)
        {
            bool notTake = dp[index-1][target];
            bool take = false;
            if(target >= arr[index])
            {
                take = dp[index-1][target - arr[index]];
            }
            dp[index][target] = take | notTake;
        }
    }
    // we are going from 0 to n-1 here in index and 0 to k in target
    so dp[n-1][k] has our answer
    return dp[n-1][k];
}

bool subsetSumToK(int n, int k, vector<int> &arr) {
    return Tabulation(n,k,arr);
}

```

Rod cutting problem

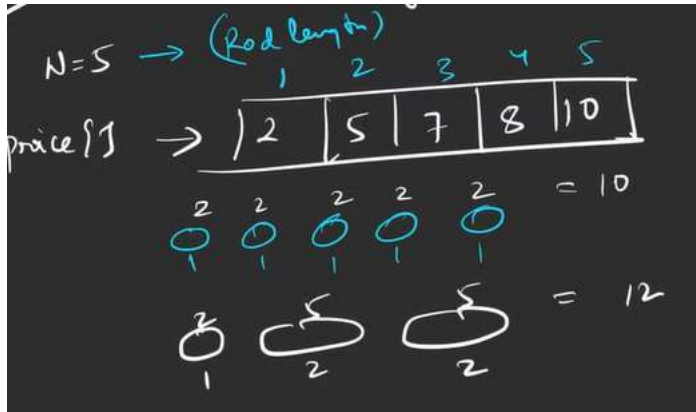
Given a rod of length 'N' units. The rod can be cut into different sizes and each size has a cost associated with it. Determine the maximum cost obtained

by cutting the rod and selling its pieces.

Note:

1. The sizes will range from 1 to 'N' and will be integers.
2. The sum of the pieces cut should be equal to 'N'.
3. Consider 1-based indexing.

We are given an Array of N size where value of each index shows price of cutting rod into ith piece

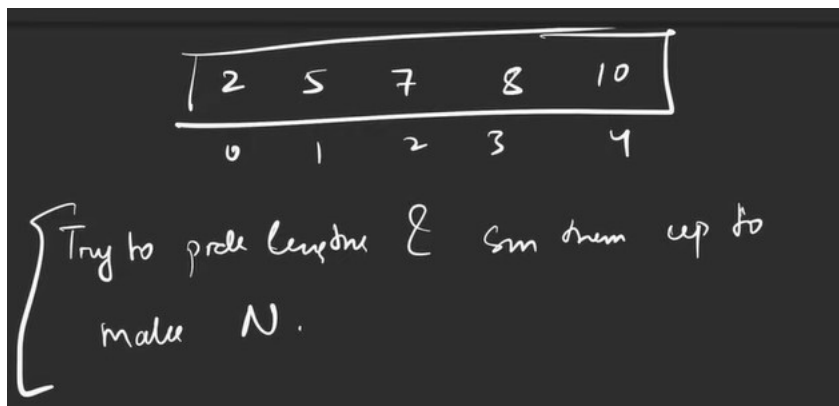


We need to return maximum such cost.

Instead of returning max cost in cutting rod into N pieces we can say Return maximum price for rod length collected to make N

If array is of 0-based indexing, then $arr[0]$ means price of cutting rod into 1 piece
 $arr[1]$ means cost of cutting rod into 2 piece and so on

We try to pick lengths in all possible ways and sum them up to make N



To try all possible ways, we make an recurrence relation

How to write Recurrence

1. Express $\rightarrow (ind, N)$
2. Explore all possibilities \rightarrow not Take
 \rightarrow Take
3. Minimize the possib

We start from $f(index, N)$ which means till index = index, what is maximum price we can make

We can pick a index as many times as we want

We make a case of Take / not-Take

We initialise take with INT_MIN as we need maximum price

```
int notTake = 0 + f(ind-1, N)
int take = INT_MIN;
rodLength = ind + 1;
if (rodLength <= N) take = price[ind] + f(ind, N - rodLength)
```

We move from $n-1$ to 0

What will be base case?

If we reach $index = 0$, We can pick it with $price = N * price[0]$ because say, we have only N part left and we have only $index = 0$ part which we can use so we need $index = 0$, N times to fulfill N part so price becomes $N * arr[0]$

```
f(ind, N)
{
    if (ind == 0)
    {
        return (N * price[0])
    }
    // ... f(ind-1, N)
```

Recursion

TC $\rightarrow O(\text{exponential})$
 SC $\rightarrow O(\text{stack})$

Memo Code

```

if (ind == 0)
  return (w * price[ind]);
if (dp[ind][w] != -1) return dp[ind][w];
int notTake = 0 + f(ind-1, w);
int take = price[ind] + f(ind, w - rodLength);
if (rodLength <= w) take = price[ind] + f(ind, w - rodLength);
return dp[ind][w] = max(take, notTake);
  
```

Memorization

ind, N

$\{w\} \times \{N+1\}$

TC $\rightarrow O(w \times n)$
 SC $\rightarrow O(N \times w)$
 $+ O(\text{stack})$

Tabulation (Bottom Up)

Our N can go from 0 to n
 Our index can go from 0 to n

Base case:

$dp[n][n+1];$
 for $(n \rightarrow 0 \rightarrow n)$
 $dp[0][n] = N \times price[0]$

Tabulation \rightarrow Bottom Up
 1. Base Case
 $n-1 \rightarrow 0$
 Base
 2. incl $\rightarrow (1 \rightarrow n-1)$
 $n \rightarrow (0 \rightarrow n)$
 3. Copy the Rem row

Recursion Code

```

int solve(vector<int> &price, int index, int n)
{
    if(index == 0)
    {
        return n * price[0];
    }
    int notTake = 0 + solve(price, index-1, n);
    int take = INT_MIN;
    int rodLength = index + 1;
    if(rodLength <= n)
    {
        take = price[index] + solve(price, index, n - rodLength);
    }
    return max(take, notTake);
}

int cutRod(vector<int> &price, int n)
{
    return solve(price, n-1, n);
}

```

Memo Code


```

int solve(vector<int> &price, int index, int n, vector<vector<int>>
&dp)
{
    if(index == 0)
    {
        return n * price[0];
    }
    if(dp[index][n] != -1)
    {
        return dp[index][n];
    }
    int notTake = 0 + solve(price,index-1,n,dp);
    int take = INT_MIN;
    int rodLength = index + 1;
    if(rodLength<=n)
    {
        take = price[index] + solve(price, index, n - rodLength,dp);
    }
    return dp[index][n] = max(take, notTake);
}

int cutRod(vector<int> &price, int n)
{
    vector<vector<int>> dp(n, vector<int> (n+1,-1));
    return solve(price,n-1,n,dp);
}

```

Tabulation Code

```

int Tabulation(vector<int> &price, int n)
{
    vector<vector<int>> dp(n, vector<int> (n+1,0));
    for(int N = 0;N<=n; N++)
    {
        dp[0][N] = N*price[0];
    }
    for(int index = 1;index<n; index++)
    {
        for(int N = 0; N<=n; N++)
        {
            int notTake = 0 + dp[index-1][N];
            int take = INT_MIN;
            int rodLength = index + 1;
            if(rodLength<=N)
            {
                take = price[index] + dp[index][N - rodLength];
            }
            dp[index][N] = max(take, notTake);
        }
    }
    return dp[n-1][n];
}

int cutRod(vector<int> &price, int n)

```

```
{
    return Tabulation(price,n);
}
```

Palindrome Partitioning 2

You are given a string 'str' of length 'n'
Find the minimum number of partitions in the string so
that no partition is empty and every partitioned
substring is a palindrome.

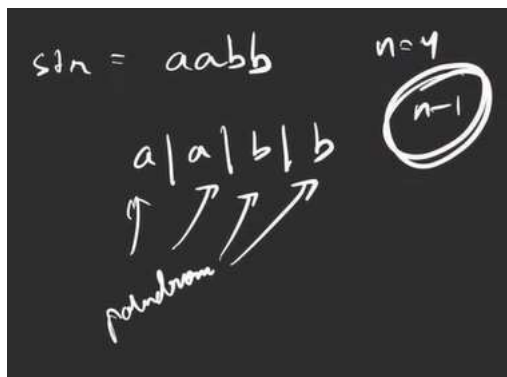
Example:

Input: 'str' = "aaccb"

Output: 2

Explanation: We can make a valid partition like aa | cc
| b.

We will have n-1 partitions



We need to find minimum number of partitions which can give us string where
every partition is palindrome and not empty.

Front Partition Approach

We start from front index and check if we can make a partition after first index,
if yes

We do 1 + (rest of string)

Now we work upon rest of the string

When we do partition everytime, we check if its previous whole string is a
palindrome or not

For the given string, we can do partition at 3 points and each partition gives us
some result, we need to take the minimum result

bababcbadcede (front partition)
 + (ababcbadcede) ↓ 1 + (abcbadcede)
 1 + (cbadcede) min?

Recurrence Relation

We are trying all partitions

We start initial index from $i = 0$ as we are doing front partition.

Express all possibilities

Take min of all possibilities

Write base case

Base case

When we reach end of string, we return 0

We take a variable `Min_cost = INT_MAX` to store cost

We take another index j , to store whole string between i and j we make a variable `temp`, and check if its palindrome, if its palindrome then only we can make a partition
 So we add $+ 1$ to cost and call for $j+1$ i.e next index

`Min_cost = min(cost, Min_cost)`

Return `Min_cost`

```

if (i == n) return 0;
temp = "";
minCost = INT_MAX;
for (j = i; j < n; j++) {
    temp += s[j];
    if (isPalindrome(temp)) {
        cost = 1 + j(j+1);
        minCost = min(minCost, cost);
    }
}
return minCost;

```

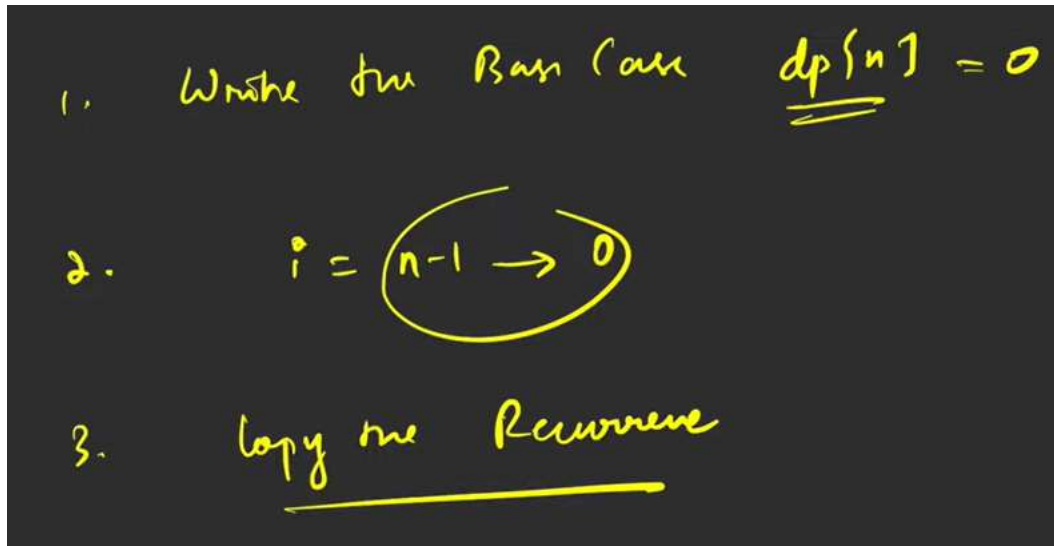
Complexity of Recurrence is Exponential so we apply **Memoisation**

Here only one parameter is changing i.e index i, so we take dp[i]

Tabulation

When index == n, return 0 means $dp[n] = 0$

In recurrence we move i from 0 to n-1 so in Tabulation we move i from n-1 to 0



Recursion Code

```
bool isPalindrome(int i, int j, string str)
{
    while(i < j)
    {
        if(str[i] != str[j])
        {
            return false;
        }
        i++;
        j--;
    }
    return true;
}

int solve(string str, int index, int n)
{
    if(index == n)
    {
        return 0;
    }
    int Min_cost = INT_MAX;
    for(int j = index; j < n; j++)
    {
        if(isPalindrome(index, j, str))
        {
            int cost = 1 + solve(str, j+1, n);
            Min_cost = min(Min_cost, cost);
        }
    }
}
```

```

    }
    return Min_cost;
}

int palindromePartitioning(string str)
{
    int n = str.size();
    //we need to do -1 in the answer because our code run till i ==
n means it puts a partition after last index also
    // which is not needed so we do -1 below
    return solve(str,0,n) -1;
}

```

Memo Code

```

bool isPalindrome(int i, int j, string str)
{
    while(i<j)
    {
        if(str[i] != str[j])
        {
            return false;
        }
        i++;
        j--;
    }
    return true;
}

int solve(string str, int index,int n,vector<int> &dp)
{
    if(index == n)
    {
        return 0;
    }
    if(dp[index] != -1)
    {
        return dp[index];
    }
    int Min_cost = INT_MAX;
    for(int j = index; j<n ; j++)
    {
        if(isPalindrome(index,j,str))
        {
            int cost = 1 + solve(str,j+1,n,dp);
            Min_cost = min(Min_cost, cost);
        }
    }
    return dp[index] = Min_cost;
}

int palindromePartitioning(string str)
{
    int n = str.size();

```

```

    //we need to do -1 in the answer because our code run till i ==
n means it puts a partition after last index also
    // which is not needed so we do -1 below
    vector<int> dp(n,-1);
    return solve(str,0,n,dp) -1;
}

```

Tabulation Code

```

bool isPalindrome(int i, int j, string str)
{
    while(i<j)
    {
        if(str[i] != str[j])
        {
            return false;
        }
        i++;
        j--;
    }
    return true;
}

```

```

int palindromePartitioning(string str)
{
    // Tabulation code
    int n = str.size();
    //we need to do -1 in the answer because our code run till i ==
n means it puts a partition after last index also
    // which is not needed so we do -1 below
    vector<int> dp(n+1,0);
    dp[n] = 0;
    for(int i = n-1; i>=0; i--)
    {
        int Min_cost = INT_MAX;
        for(int j = i; j<n ; j++)
        {
            if(isPalindrome(i,j,str))
            {
                int cost = 1 + dp[j+1];
                Min_cost = min(Min_cost, cost);
            }
        }
        dp[i] = Min_cost;
    }
    return dp[0]-1;
}

```

Egg Dropping Puzzle

There exists a floor **f** where **0** <= **f** <= **K** such that any egg dropped from a floor higher than **f** will break, and any egg dropped **from or below** floor **f** will **not** break.

There are few rules given below.

- An egg that survives a fall can be used again.
- A broken egg must be discarded.
- The effect of a fall is the same for all eggs.
- If the egg doesn't break at a certain floor, it will not break at any floor below.
- If the eggs breaks at a certain floor, it will break at any floor above.

Return the minimum number of moves that you need to determine with certainty what the value of f is.

Example 1:

Input:

$N = 1, K = 2$

Output: 2

Explanation:

1. Drop the egg from floor 1. If it breaks, we know that $f = 0$.
2. Otherwise, drop the egg from floor 2.
If it breaks, we know that $f = 1$.
3. If it does not break, then we know $f = 2$.
4. Hence, we need at minimum 2 moves to determine with certainty what the value of f is.

Example 2:

Input:

$N = 2, K = 10$

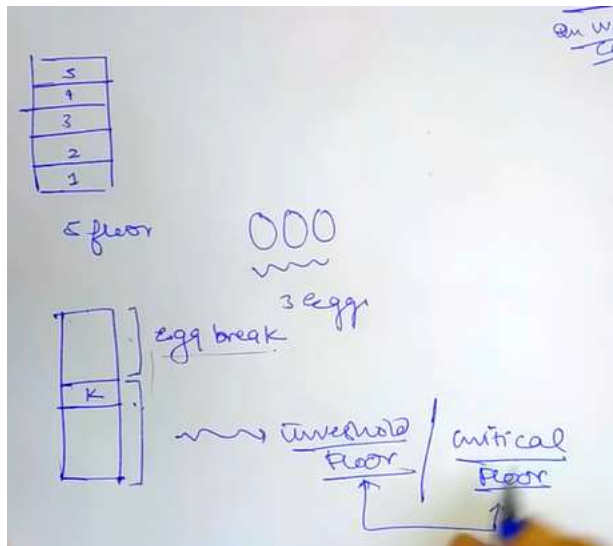
Output: 4

Number of eggs and number of floors are given

We need to find critical / threshold floor

What is critical / threshold floor?

A floor " k " including it and above which if we throw egg from any floor, the egg will break and below which if we use any floor to throw egg, the egg will not break.



We need the minimum number of attempts in finding the critical floor.

We will go to every floor and and throw egg

If egg break, go to lower floors so that chances are egg will not break at some floor

We need to use number of eggs given very wisely. Our technique should be best.

Let say we have number of eggs = 3

We have number of floors = 50

We throw egg from floor = 50, egg break, now we have 2 eggs, we go to lower floor

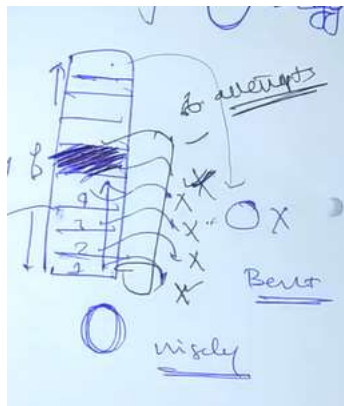
We throw egg from floor = 49, egg break, now we have 1 eggs, go to lower floor

We throw egg from floor = 48, egg break, now we have 0 eggs

Let say our critical floor was = 12, but now we don't have eggs to check so we need to use our eggs wisely

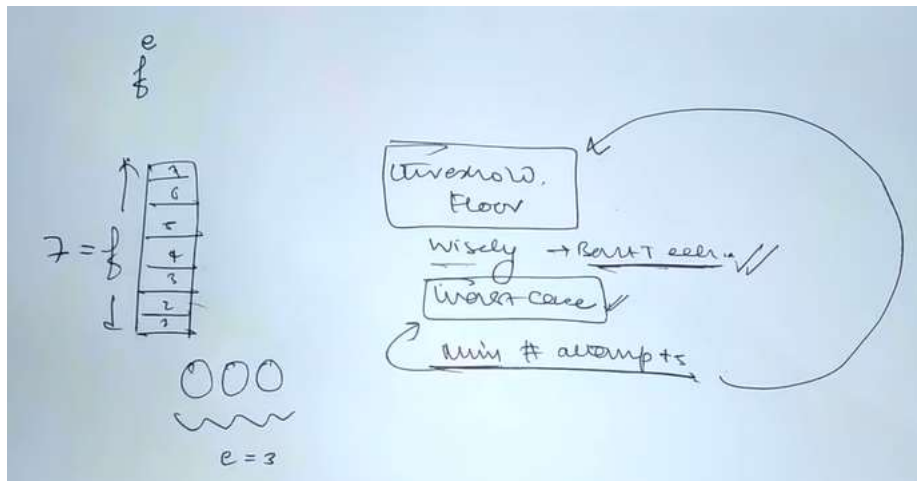
If we would have started from floor = 1, egg would not have broken and we could have been able to re-use it.

So best technique is to start dropping from lowest floor

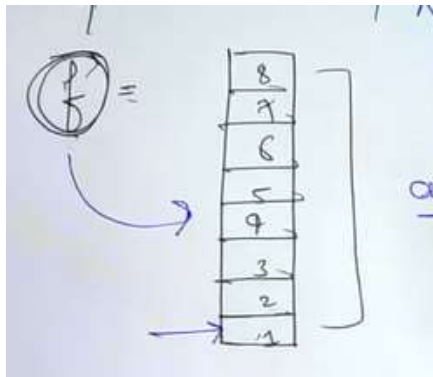


In worst case, we will reach top floor and it's the critical floor then it take us f attempts

In worst case, we need to find minimum number of attempts to find threshold floor, using best technique.



f represents number of floors in a building, which starts from 1 to f
This can be analogous to an array only,



MCM Variation

We take an pointer i at 1st floor and j pointer at last floor

Now how to take k ?

We will check for each value so k can go from 1st floor to last floor

Base case

Think of the smallest valid input

Egg = 0, this is invalid condition according to problem statement

Egg = 1, then we need to go to f floors, return f

Floor = 0, return 0 as there is no floor

Floor = 1, return 1 as there is only 1 floor

Possibilities

If we drop an egg there are **2 possibilities**

We begin from function(egg, floor)

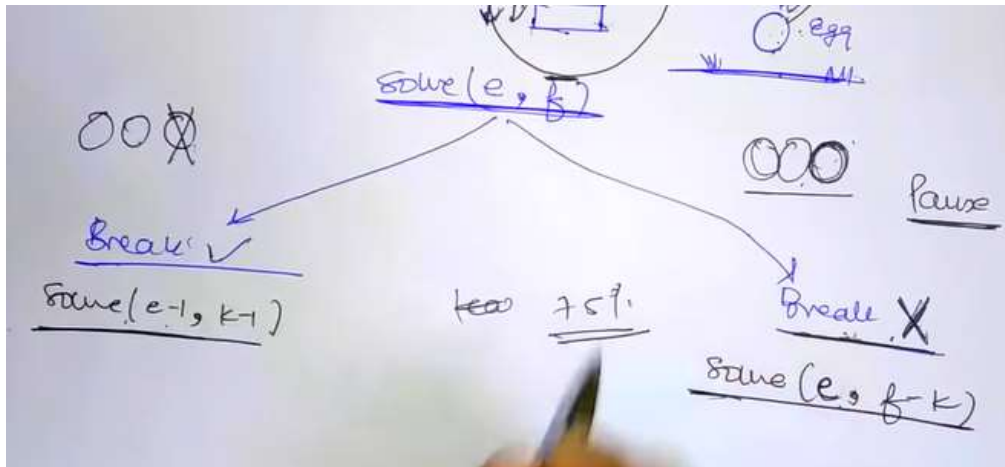
1. **It will break**, say its k th floor so egg will break for all floors $> k$
And our threshold floor is the one jiske upar break krta h and jiske neeche nhi break krta so threshold floor in below k , so we go $k-1$ and egg broke so egg =

egg-1

Function (egg-1, k-1);

2. **It will not break**, means we need to check above k as for all below k, egg will not break. We need to check (f - k) floors now, egg will not break means It can be re-used so egg = egg only

Function(egg, F - K);



Code:

```

int solve (int e, int f)
{
    if (f == 0 || f == 1)
        return f;

    if (e == 1)
        return f;

    int mn = INT_MAX;
    for (int k = 1; k <= f; k++)
    {

```

```

        int temp = 1 + max (
            solve(e-1, k-1),
            solve(e, f-k)
        );

        mn = min(mn, temp);
    }

    return mn;
}

```

Handwritten notes on the code: "max" is written above the max function call. "min" is written below the min function call. "max case" is circled next to the max function call. "min" is written below the min function call. "max" is written to the right of the max function call. "min" is written to the right of the min function call.

```

int solve(int egg, int floor)
{
    // if there is only 0 or 1 floor left
    if(floor==0 || floor==1) return floor;

    // if there is only 1 egg, then the floor we are at is the critical/threshold floor
    if(egg==1) return floor;

    int mini = INT_MAX;

    // we run loop for each floor and apply break/ not break condition
    for(int k = 1; k<= floor; k++)
    {
        // we need to solve for the worst case so we use max() to get the worst case answer from break and not break condition for each floor
        int temp = 1 + max(solve(egg-1,floor-1), solve(egg, floor - k));

        // get the minimum number of attempts from that worst case answer to find threshold floor
        mini = min(mini,temp);
    }
    return mini;
}

int eggDrop(int n, int k)
{
    return solve(n,k);
}

```

Memoization

Why Memoization is needed?

If we draw a complete Recursive Tree, we observe there are some **overlapping sub problems**.

We will make a matrix, we see there are 2 changing parameters in our recurrence, egg and floor so we make 2D DP Array initialised with -1.

What will be size and dimension of Matrix?
It depends on number of changing variables.

```

int solve(int egg, int floor, vector<vector<int>> &dp)
{
    // if there is only 0 or 1 floor left
    if(floor==0 || floor==1) return floor;

    // if there is only 1 egg, then the floor we are at is the critical/threshold floor
    if(egg==1) return floor;

```

```

    if(egg==0) return 0;

    if(dp[egg][floor] != -1) return dp[egg][floor];

    int mini = INT_MAX;

    // we run loop for each floor and apply break/ not break condition
    for(int k = 1; k<= floor; k++)
    {
        // we need to solve for the worst case so we use max() to get the worst case answer from break and not break condition for each floor
        int temp = 1 + max(solve(egg-1,floor-k,dp), solve(egg, floor - k,dp));

        // get the minimum number of attempts from that worst case answer to find threshold floor
        mini = min(mini,temp);
    }
    return dp[egg][floor] = mini;
}

int eggDrop(int n, int k)
{
    vector<vector<int>> dp(n+1, vector<int>(k+1,-1));
    return solve(n,k,dp);
}

```

Word Break

Given a string *s* and a dictionary of strings *wordDict*, return true if *s* can be segmented into a space-separated sequence of one or more dictionary words.

Note that the same word in the dictionary may be reused multiple times in the segmentation.

Example 1:

Input: *s* = "leetcode", *wordDict* = ["leet","code"]

Output: true

Explanation: Return true because "leetcode" can be segmented as "leet code".

Example 2:

Input: *s* = "applepenapple", *wordDict* = ["apple","pen"]

Output: true

Explanation: Return true because "applepenapple" can be segmented as "apple pen apple".

Note that you are allowed to reuse a dictionary word.

Example 3:

Input: *s* = "catsanddog", *wordDict* = ["cats","dog","sand","and","cat"]

Output: false

```

bool solve(string s, int index, set<string> &st)
{
    if(index == s.size()) return true;

```

```

// make an temp string
string temp = "";

for(int j = index; j< s.size(); j++)
{
    // store character by character inside the string temp and c
    // check if it matches the dict
    temp += s[j];
    if(st.find(temp) != st.end())
    {
        // check for next index of j
        if(solve(s,j+1,st))
        {
            return true;
        }
    }
}
return false;
}

bool wordBreak(string s, vector<string>& wordDict) {
    // What we do is we will pick one character and try to match it
    // in the dictionary
    // starting from index = 0, we run a loop j = i to j < s.size()
    // we will store dict in set so that its easy to compare
    // gives TLE
    set<string> st;
    for(auto it: wordDict)
    {
        st.insert(it);
    }
    return solve(s,0,st);
}

```

Memoized Code:

```

bool solve(string s, int index, set<string> &st,vector<int> &dp)
{
    if(index == s.size()) return true;

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

    // make an temp string
    string temp = "";

    for(int j = index; j< s.size(); j++)
    {
        // store character by character inside the string temp and c
        // check if it matches the dict
        temp += s[j];
        if(st.find(temp) != st.end())
        {
            // check for next index of j
            if(solve(s,j+1,st,dp))
            {
                return dp[index] = true;
            }
        }
    }
}

```

```

    }
}
return dp[index] = false;
}

bool wordBreak(string s, vector<string>& wordDict) {
    // What we do is we will pick one character and try to match it
    // in the dictionary
    // starting from index = 0, we run a loop j = i to j < s.size()
    // we will store dict in set so that its easy to compare
    // gives TLE
    // let us make an DP array, we have only one changing variable i
    // i.e index so we make 1D DP array
    // Instead of calculating for index i again and again we pass
    // DP array and store result in it.
    set<string> st;
    vector<int> dp(s.size(), -1);
    for(auto it: wordDict)
    {
        st.insert(it);
    }
    return solve(s, 0, st, dp);
}

```

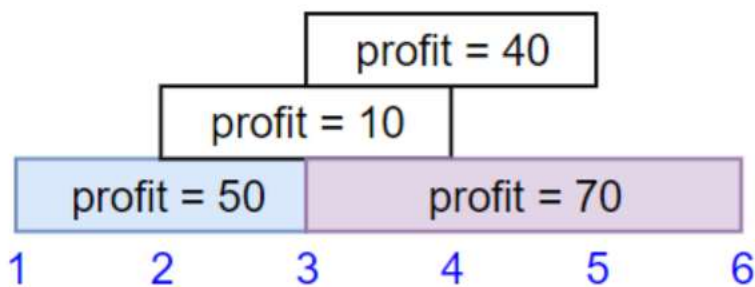
Maximum Profit in Job Scheduling

We have n jobs, where every job is scheduled to be done from startTime[i] to endTime[i], obtaining a profit of profit[i].

You're given the startTime, endTime and profit arrays, return the maximum profit you can take such that there are no two jobs in the subset with overlapping time range.

If you choose a job that ends at time X you will be able to start another job that starts at time X.

Example 1:

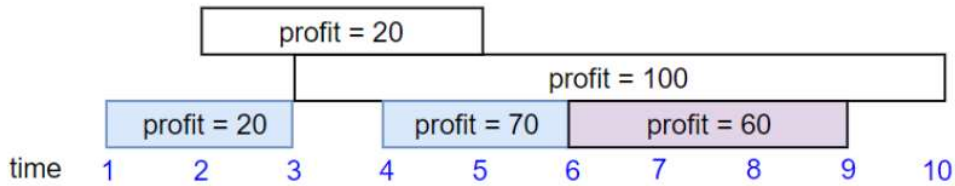


Input: startTime = [1,2,3,3], endTime = [3,4,5,6], profit = [50,10,40,70]

Output: 120

Explanation: The subset chosen is the first and fourth job. Time range [1-3]+[3-6] , we get profit of 120 = 50 + 70.

Example 2:

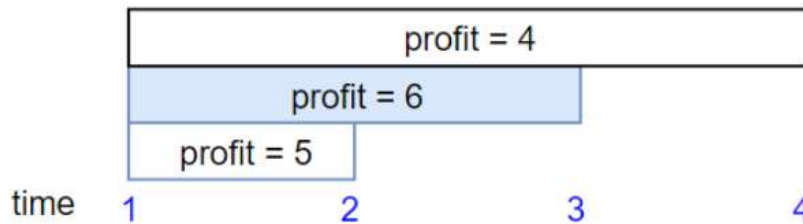


Input: startTime = [1,2,3,4,6], endTime = [3,5,10,6,9], profit = [20,20,100,70,60]

Output: 150

Explanation: The subset chosen is the first, fourth and fifth job. Profit obtained $150 = 20 + 70 + 60$.

Example 3:



Input: startTime = [1,1,1], endTime = [2,3,4], profit = [5,6,4]

Output: 6

Starting and ending time of 2 jobs should not overlap and we need maximum profit

We can do sorting for ease in solving

ST	ET	Profit	After sorting
3	10	20	1-2 = 50
1	2	50	3-10 = 20
6	19	100	6-19 = 100
2	100	200	2-100 = 200

We cannot try greedy here, we need to take each case and find out profit for it

We will try pick / not pick approach

While picking we check that it does not overlap with our previous job

We store maximum in the answer

