

6

Backtracking

Syllabus

General method, Recursive backtracking algorithm, Iterative backtracking method, n-Queen problem, Sum of subsets, Graph coloring, 0/1 Knapsack Problem.

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6.1 General Method

SPPU : Dec.-06,10,11,12,13, May-08,11,15,18, Marks 18

- In the backtracking method
 - The desired solution is expressible as an n tuple (x_1, x_2, \dots, x_n) where x_i is chosen from some finite set S_i .
 - The solution maximizes or minimizes or satisfies a criterion function $C(x_1, x_2, \dots, x_n)$.

- The problem can be categorized into three categories. For instance - For a problem P let C be the set of constraints for P. Let D be the set containing all solutions satisfying C then
 - Finding whether there is any feasible solution ? - Is the decision problem.
 - What is the best solution ? - Is the optimization problem.

- Listing of all the feasible solution - Is the enumeration problem.

- The basic idea of backtracking is to build up a vector, one component at a time and to test whether the vector being formed has any chance of success.

- The major advantage of backtracking algorithm is that we can realize the fact that the partial vector generated does not lead to an optimal solution. In such a situation that vector can be ignored.

- Backtracking algorithm determines the solution by systematically searching the solution space (i.e. set of all feasible solutions) for the given problem.

- Backtracking is a depth first search with some bounding function.**

- Backtracking algorithm solves the problem using two types of constraints -

- Explicit constraint and Implicit constraints**

- Definition :** Explicit constraints are the rules that restrict each element x_i has to be chosen from given set only. Explicit constraints depends on particular instance I of the problem.

- All the tuples from solution set must satisfy the explicit constraints.

- Definition :** Implicit constraints are the rules that decide which tuples in the solution space of I satisfy the criterion function. Thus the implicit constraints represent by which x_i in the solution set must be related with each other.

For example

Example 1 : 8 - Queen's problem - The 8-queen's problem can be stated as follows. Consider a chessboard of order 8×8 . The problem is to place 8 queens on this board such that no two queens can attack each other. That means no two queens can be placed on the same row, column or diagonal. The solution to 8-queens problem can be obtained using backtracking method.

Design and Analysis of Algorithm
The solution can be given as below -

1	2	3	4	5	6	7	8
•							
	•						
		•					
			•				
				•			
					•		
						•	

This 8 Queen's problem is solved by applying implicit and explicit constraints. The explicit constraints show that the solution space S_i must be = $\{1, 2, 3, 4, 5, 6, 7, 8\}$ with $1 \leq i \leq 8$. Hence solution space consists of 8^8 8-tuples. The implicit constraint will be -

- No two x_i will be same. That means all the queens must lie in different columns.

- No two queens can be on the same row, column or diagonal.

Hence the above solution can be represented as an 8-tuple $\{4, 6, 8, 2, 7, 1, 3, 5\}$.

Example 2 : Sum of subsets -

There are n positive numbers given in a set. The desire is to find all possible subsets of this set, the contents of which add onto a predefined value M.

In other words,

Let there be n elements given by the set $w = (w_1, w_2, w_3, \dots, w_n)$ then find out all the subsets from whose sum is M.

For example

Consider $n = 6$ and $(w_1, w_2, w_3, w_4, w_5, w_6) = (25, 8, 16, 32, 26, 52)$ and $M = 59$ then we will get desired sum of subset as $(25, 8, 26)$.

We can also represent the sum of subset as $(1, 1, 0, 0, 1, 0)$. If solution subset is represented by an n-tuple (x_1, x_2, \dots, x_n) such that x_i could be either 0 or 1. The $x_i = 1$ means the weight w_i is to be chosen and $x_i = 0$ means that weight w_i is not to be chosen.

The explicit constraint on sum of subset problem will be that any element $x_i \in \{j | j \text{ is an integer and } 1 \leq i \leq x\}$. That means we must select the integer from given set of elements. The implicit constraints on sum of subset problem will be -

- 1) No two elements will be the same. That means no element can be repeatedly selected.
- 2) The sum of the elements of subset = M (a predefined value).

3) The selection of the elements should be done in an orderly manner. That means (1, 3, 7) and (1, 7, 3) are treated as same.

Ex. 6.1.1 Define following terms : State space, explicit constraints, implicit constraints, problem state, solution states, answer states, live node, E-node, dead node, bounding functions.

SPPU : Nov-11, Marks 8 Dec-11 Marks 16 Dec-12 Marks 18 May-18, End Sem., Marks 8

Sol.: The tree organization for 4-queen's problems is shown by given Fig. 6.1.1(on next page).

State space : All paths from root to other nodes define the state space of the problem.

Explicit constraints : Explicit constraints are rules, which restrict, each vector element to be chosen from given set.

Implicit constraints : Implicit constraints are rules which determine which of the tuples in the solution space satisfy the criterion function.

Problem states : Each node in the state space tree is called problem state.

Solution states : The solution states are those problem states s for which the path from root to s defines a tuple in the solution space. In some trees the leaves define solution states.

Answer states : These are the leaf nodes which correspond to an element in the set of solutions. These are the states which satisfy the implicit constraints.

Live node : A node which is generated and whose children have not yet been generated is called live node.

E-node : The live node whose children are currently being expanded is called E-node.

Dead node : A dead node is a generated node which is not to be expanded further or all of whose children have been generated.

Bounding functions : Bounding functions will be used to kill live nodes without generating all their children. A care should be taken while doing so, because atleast one answer node should be produced or even all the answer nodes be generated if problem needs to find all possible solutions.

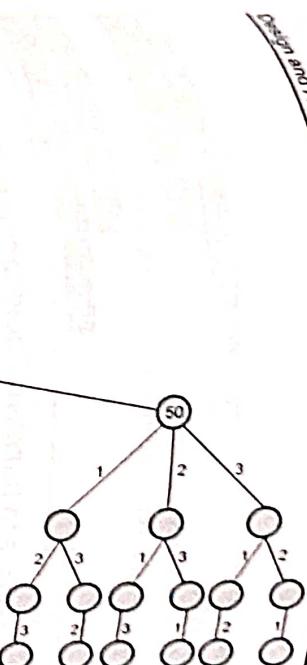


Fig. 6.1.1 State space tree for 4-queens problems

- Q.1** What are the constraints that must be satisfied while solving any problem using backtracking? Explain briefly. **SPPU : Dec-06, Marks 4** **Dec-10, Marks 6**
- Q.2** Enlist the characteristics of backtracking strategy. **SPPU : May-08, Marks 6**
- Q.3** Explain the following terms : Live nodes, expanding nodes, bounding function and solution space. **SPPU : Dec-13, Marks 8**
- Q.4** Write short note on state space tree. **SPPU : May-15, End Sem, Marks 2**

6.2 Recursive Backtracking and Iterative Backtracking Algorithm

SPPU : Dec-06,07, 18, May-07,15,18 Marks 8

Backtracking algorithms determine problem solutions by systematically searching for the solutions using tree structure.

For example -

Consider a 4-queen's problem. It could be stated as "there are 4 queens that can be placed on 4×4 chessboard. Then no two queens can attack each other".

Following Fig. 6.2.1 shows tree organization for this problem. [See Fig 6.2.1 on next page]

- Each node in the tree is called a problem state.
- All paths from the root to other nodes define the state space of the problem.
- The solution states are the problem states (s) for which the path from root to s defines a tuple in the solution space.

In some trees the leaves define the solution states.

- Answer states : These are the leaf nodes which correspond to an element in the set of solutions, these are the states which satisfy the implicit constraints.

For example

- A node which has been generated and all whose children have not yet been generated is called live node.
- The live node whose children are currently being expanded is called E-node.
- A dead node is a generated node which is not to be expanded further or all of whose children have been generated.
- There are two methods of generating state search tree -

- i) Backtracking - In this method, as soon as new child C of the current E-node N is generated, this child will be the new E-node.

The N will become the E-node again when the subtree C has been fully explored.

- ii) Branch and Bound - E-node will remain as E-node until it is dead.

- Both backtracking and branch and bound methods use bounding functions. The bounding functions are used to kill live nodes without generating all their children. The care has to be taken while killing live nodes so that at least one answer node or all answer nodes are obtained.

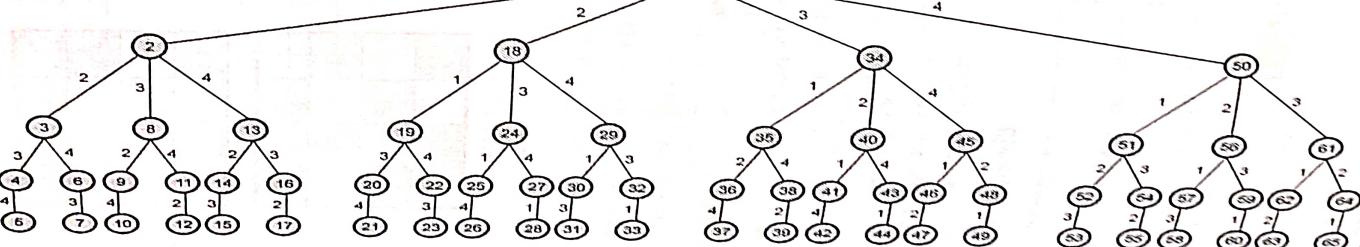


Fig. 6.2.1 State-space tree for 4-queens problem

Backtracking

design and Analysis of Algorithms

Review Questions

- Q.1** Write a recursive algorithm which shows a recursive formulation of the backtracking technique.
SPPU : Dec.-06, Dec.-18, End Sem. Marks 8
- Q.2** Write a schema for an iterative backtracking method.
SPPU : May-07, Dec.-07, Marks 8
- Q.3** What is backtracking ? Write general iterative algorithm for backtracking.
SPPU : May-15, End Sem. Marks 8
- Q.4** Write a recursive and Iterative algorithm of backtracking method.
SPPU : May-18, End Sem. Marks 8

6.3 Applications of Backtracking

Various applications that are based on backtracking method are -

1. 8 Queen's problem : This is a problem based on chess games. By this problem, it is stated that arrange the queens on chessboard in such a way that no two queens can attack each other.
2. Sub of subset problem.
3. Graph coloring problem.
4. Finding Hamiltonian cycle.
5. Knapsack problem.

6.4 The n-Queen Problem

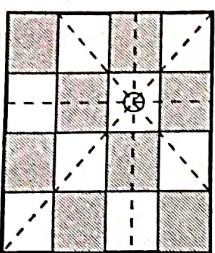
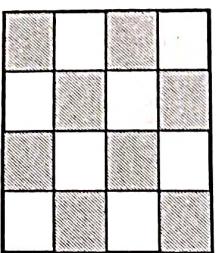
SPPU : May-11,12,14, 19, Marks 10

The n-queens problem can be stated as follows.

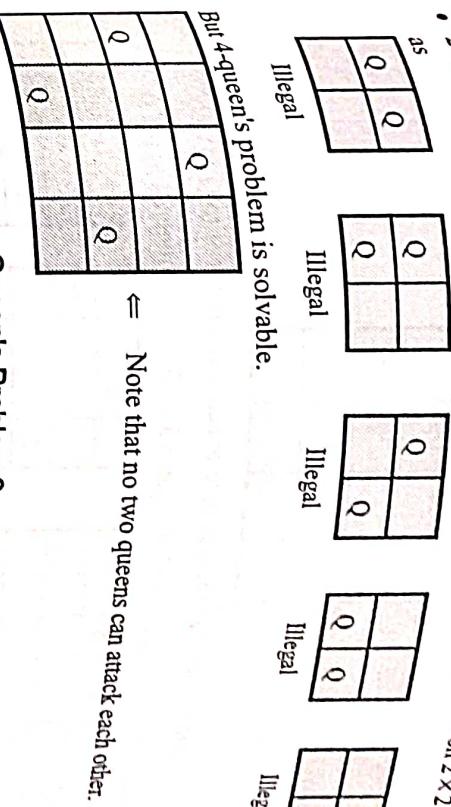
Consider a $n \times n$ chessboard on which we have to place n queens so that no two queens attack each other by being in the same row or in the same column or on the same diagonal.

For example

Consider 4×4 board



The next queen - if is placed on the paths marked by dotted lines then they can attack each other



6.4.1 How to Solve n-Queen's Problem ?

Let us take 4-queens and 4×4 chessboard.

Now we start with empty chessboard.

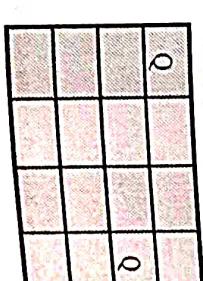
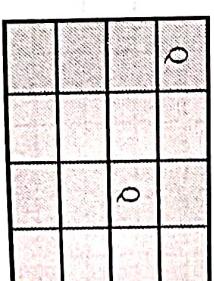
- Place queen 1 in the first possible position of its row i.e. on 1st row and 1st column.



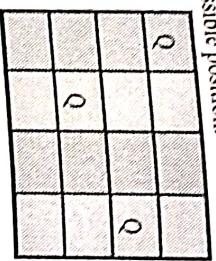
- Then place queen 2 after trying unsuccessful place - 1(1, 2), (2, 1), (2, 2) at (2, 3) i.e. 2nd row and 3rd column.



- This is the dead end because a 3rd queen cannot be placed in next column, as there is no acceptable position for queen 3. Hence algorithm backtracks and places the 2nd queen at (2,4) position.

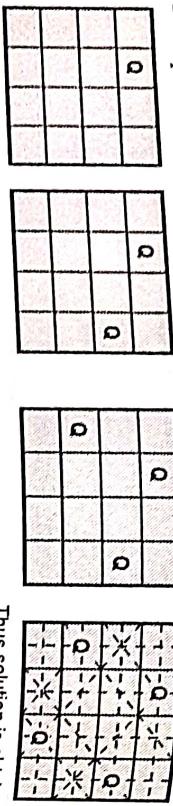


- The place 3rd queen at (3, 2) but it is again another dead end as next queen (4th queen) cannot be placed at permissible position.



Hence we need to backtrack all the way upto queen 1 and move it to (1, 2).

- Place queen 1 at (1, 2), queen 2 at (2, 4), queen 3 at (3, 1) and queen 4 at (4, 3).



Thus solution is obtained.

(2, 4, 1, 3) in rowwise manner.

The state space tree of 4-queen's problem is shown in Fig. 6.4.1 [See Fig. 6.4.1 on next page].

Now we will consider how to place 8-Queen's on the chessboard.

- Initially the chessboard is empty.

1 2 3 4 5 6 7 8

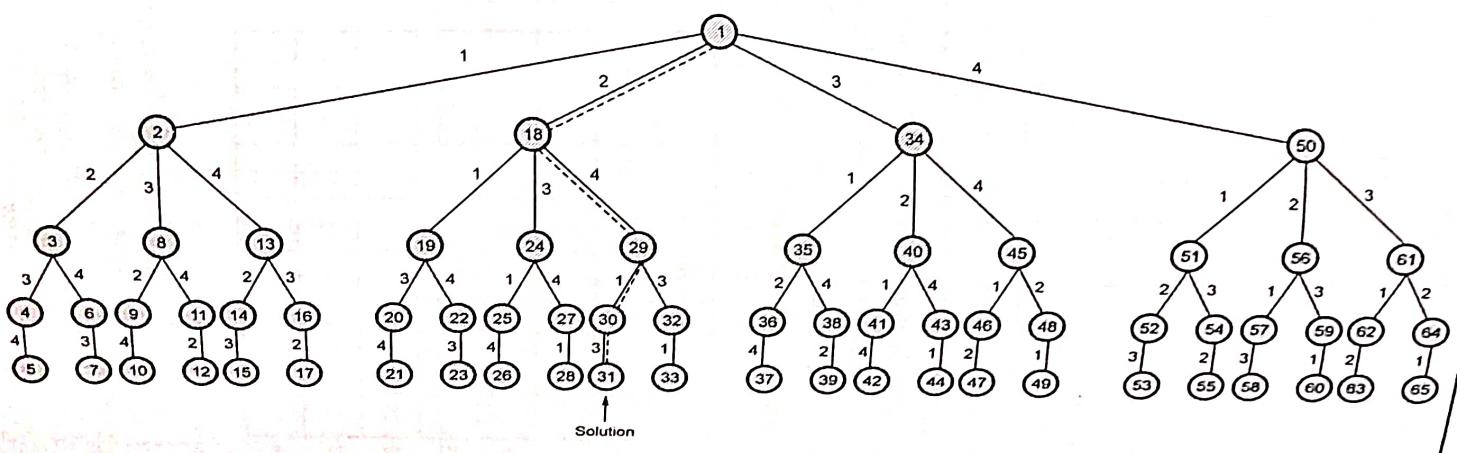
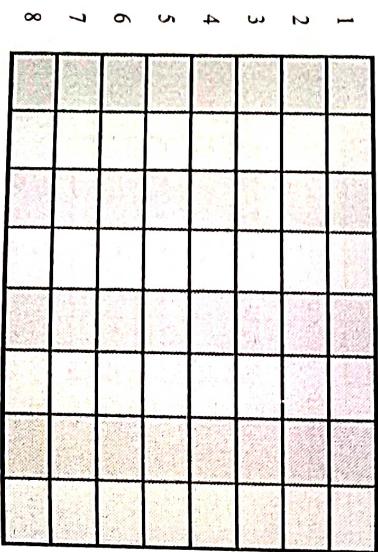


Fig. 6.4.1 State space tree for 4-queens problem

Now we will start placing the queens on the chessboard.

	1	2	3	4	5	6	7	8
1	Q1							
2		Q2						
3	Q3							
4		Q4						
5			Q5					
6				Q6				
7					Q7			
8						Q8		

Thus we have placed

5 queens in such a way that no two queens can attack each other. Now if we want to place Q6 at location (6, 6) then queen Q5 can attack, if Q6 is placed at (6, 7) then Q1 can attack, if Q6 is placed at (6, 8) then Q2 can attack it. Similarly at (6, 5) the Q5 will attack it. At (6, 4) the Q2 will attack, at (6, 3) the Q4 will attack, at (6, 2) the Q1 will attack and at (6, 1) Q3 will attack the queen Q6. This shows that we need to backtrack and

change the previously placed queens positions. It could then be -

	1	2	3	4	5	6	7	8
1		Q1						
2			Q2					
3				Q3				
4					Q4			
5						Q5		
6							Q6	
7								Q7
8								

If we place Q7 here, Q4 can attack Q7
Here Q3 can attack Q7
Here Q5 can attack Q7
Here Q4 can attack Q7
Here Q2 can attack Q7
Here Q1 can attack Q7

Backtracking

	1	2	3	4	5	6	7	8
1	Q1							
2								
3			Q3					
4				Q4				
5					Q5			
6						Q6		
7							Q7	
8								Q8

But again Q8 cannot be placed at any empty location safely. Hence we need to backtrack. Finally the successful placement of all the eight queens can be shown by following figure.

	1	2	3	4	5	6	7	8
1		Q1						
2							Q2	
3			Q3					
4				Q4				
5					Q5			
6						Q6		
7							Q7	
8								Q8

Hence we have to backtrack to adjust already placed queens.

Backtracking

6.4.2 Algorithm

```
Algorithm Queen(n)
//Problem description: This algorithm is for implementing n
//Queen's problem
```

/Input : total number of queen's n.

for column ← 1 to n do

This function checks if
two queens are on the
same diagonal or not.

if(place(row,column))then

{

board[row][column] = no conflict so place queen.

```

if(row==n) then //dead end
    print_board(n)
    //printing the board configuration
    else/try next queen with next position
        Queen(row+1,n)
    }
}

```

Row by row each queen is placed by satisfying constraints.

```

Algorithm place(row,column)
//Problem Description : This algorithm is for placing the queen at appropriate position
//Input : row and column of the chessboard
//output : returns 0 for the conflicting row and column
//position and 1 for no conflict.

for i ← 1 to row-1 do
    { //checking for column and diagonal conflicts
        if(board[i] == column)then
            return 0
        else if(abs(board[i]- column) == abs(i - row))then
            return 0
    }
    //no conflicts hence Queen can be placed
    return 1
}

```

Same column by 2 queen's

This formula gives that 2 queens are on same diagonal

```

C Functions

* By this function we try the next free slot
and check for proper positioning of queen
*
void Queen(int row,int n)
{
    int column;
    for(column=1;column<=n;column+++)
    {
        if(place(row,column))
        {
            board[row] = column; //no conflict so place queen
            if(row==n) //dead end

```

//printing the board configuration

else //try next queen with next position

Queen(row+1,n);

int place(**int** row,**int** column)

int i;

for(**i**=1;**i**<=row-1;**i**+)

{ **//checking for column and diagonal conflicts**

if(board[i] == column)

return 0;

else

if(abs(board[i] - column) == abs(**i** - row))

return 0;

}

//no conflicts hence Queen can be placed

return 1;

Ex 6.4.1 Solve 8-queen's problem for a feasible sequence (6, 4, 7, 1).

Sol.: As the feasible sequence is given, we will place the queens accordingly and then try out the other remaining places.

1	2	3	4	5	6	7	8
			Q				
						Q	
							Q

The diagonal conflicts can be checked by following formula -
Let, $P_1 = (i, j)$ and $P_2 = (k, l)$ are two positions. Then P_1 and P_2 are the positions that are on the same diagonal, if

$$i + j = k + l \quad \text{or}$$

$$i - j = k - l$$

Now if next queen is placed on (5, 2) then

1	2	3	4	5	6	7	8
				Q			
2					Q		
3						Q	
4							(4, 1) = P ₁
5							
6							
7							

If we place queen here then $P_2 = (5, 2)$
 $4 - 1 = 5 - 2$
 \therefore Diagonal conflicts occur. Hence try another position.

Queen Positions								Action
1	2	3	4	5	6	7	8	
6	4	7	1	2				Start
6	4	7	1	2				As $4 - 1 = 5 - 2$ conflict occurs.
6	4	7	1	2				$5 - 3 \neq 4 - 1$ or $5 + 3 \neq 4 + 1$: Feasible
6	4	7	1	3				$As 5 + 3 = 6 + 2$. It is not feasible.
6	4	7	1	3	2			Feasible
6	4	7	1	3	5			Feasible
6	4	7	1	3	5	2		List ends and we have got feasible sequence.

It can be summarized below.

The 8-queens with feasible solution (6, 4, 7, 1, 3, 5, 2, 8)
Ex. 6.4.2 Draw the tree organization of the 4-queen's solution space. Number the nodes using depth first search.

Sol.: The state space tree for 4-queen's problem consists of 4^4 leaf nodes. That means there are 256 leaf nodes. The solution space is defined by a path from root to leaf node.

The solution can be obtained for 4 queen's problem. For instance from 1 to leaf 31 represents one possible solution.

Ex. 6.4.3 For a feasible sequence (7, 5, 3, 1) solve 8 queen's problem using backtracking.

SPU : May-14. Marks 10

Sol.: While placing the queen at next position we have to check whether the current position chosen is on the same diagonal of previous queen's position.

If $P_1 = (i, j)$ and $P_2 = (k, l)$ are two positions then P_1 and P_2 lie on the same diagonal if $i + j = k + l$ or $i - j = k - l$. Let us put the given feasible sequence and try out remaining positions.

The 8-queens on 8×8 board with this sequence is -

1	2	3	4	5	6	7	8

Ex. 6.4.4 Obtain any two solutions to 4-queen's problem. Establish the relationship between them.

Sol.: The solutions to 4-queen's problem are as given below.

Erl. 6.4.5

Generate at least 3 solutions for 5-queen's problem.

SPPU : May-12 Marks 8

j →	1	2	3	4	5	6	7	8
i values i.e. row values	7	5	3	1	2			
	7	5	3	1	2			
	7	5	3	1	2			
	7	5	3	1	2			
	7	5	3	1	2			
	7	5	3	1	2			
	7	5	3	1	2			
	7	5	3	1	2			

1	Q							
2		Q						
3			Q					
4				Q				
5					Q			

Solution 1
(1, 3, 5, 2, 4)

1	Q							
2		Q						
3			Q					
4				Q				
5					Q			

Solution 2
(2, 4, 1, 3, 5)

1	Q							
2		Q						
3			Q					
4				Q				
5					Q			

1	Q							
2		Q						
3			Q					
4				Q				
5					Q			

1	Q							
2		Q						
3			Q					
4				Q				
5					Q			

Solution 3
(2, 5, 3, 1, 4)

1	Q							
2		Q						
3			Q					
4				Q				
5					Q			

Solution 4
(2, 4, 1, 3, 5)

Solution 5
(3, 1, 4, 2)

If these two solutions are observed then we can say that second solution can be simply obtained by reversing the first solution.

It is always convenient to sort the set's elements in ascending order. That is,

S VI

Let us first write a general algorithm for sum of subset problem.

Algorithm

Let, S be a set of elements and d is the expected sum of subsets. Then -

Step 1 : Start with an empty set.

Step 2 : Add to the subset, the next element from the list.

Step 3 : If the subset is having sum d then stop with that subset as solution.

Step 4: If the subset is not feasible or if we have reached the end of the see

through the subset until we find the most suitable value.

Step 5 : If the subset is feasible then repeat step 2.

Step 6 : If we have visited all the elements without finding a suitable subset and if

backtracking is possible then stop without solution. This problem can be well solved with some example.

Ex 6.51 Consider a set $S = \{5, 10, 12, 13, 15, 18\}$ and $d = 30$. Solve it for obtaining sum of understood with some example.

SPU : May-17, 18, End Sem, Dec. 18, End Sem, Marks 8

vol.:

1

Initially subset = {}	Sum = 0	
5	5	Then add next element.
5, 10	15	$\because 15 < 30$ Add next element.
5, 10, 12	27	$\because 27 < 30$ Add next element.
5, 10, 12, 13	40	Sum exceeds $d = 30$ hence backtrack.
5, 10, 12, 15	42	Sum exceeds $d = 30$ \therefore Backtrack
5, 10, 12, 18	45	Sum exceeds $d = 30$ \therefore Not feasible. Hence backtrack.
5, 10		
5, 10, 13	28	
5, 10, 13, 15	33	Not feasible \therefore Backtrack.
5, 10		
5, 10, 15	30	Solution obtained as sum = 30 = d

Fig. 6.5.1 State space tree for sum of subset

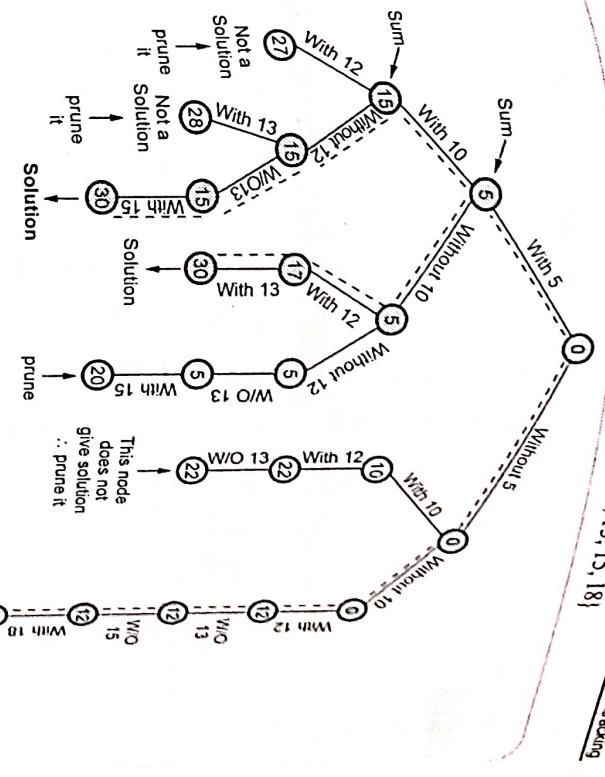


Fig. 6.5.2

Ex 6.5.2 Let $m = 31$ and $W = \{7, 11, 13, 24\}$. Draw a portion of state space tree for sum-of-subset problem for the above given algorithm.

Journal of Polymer Science: Part A: Polymer Chemistry, Vol. 33, 3535-3544 (1995)

The recursive structure of the algorithm will be, as shown in Fig. 6:

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M = 25 and

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ANSWER: 10, 11, 12, 13, 14, 15, 16, 17, 18, 19, 20

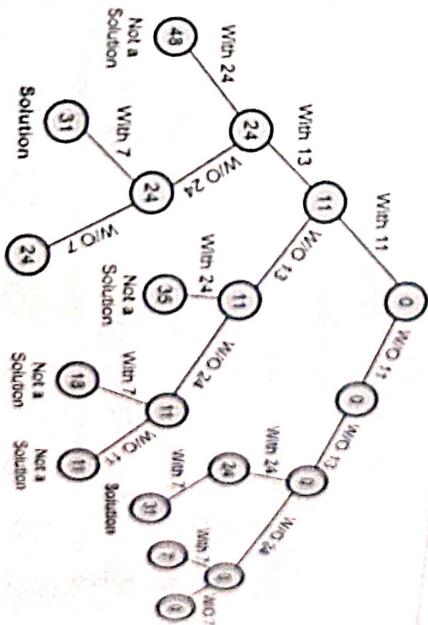
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Current Sublist	Sum = 0	Action
3	5	Then add next element
3, 4	12 < 35	Add next element
3, 4, 10	22 < 35	Add next element
3, 4, 10, 12	34 > 35	Add next element
3, 4, 10, 12, 15	49 > 35	Sum exceeds limit. Backtrack
3, 4, 10, 15	37 > 35	Backtrack
3, 4, 12	24 < 35	Select next element
3, 7, 12, 15	39 > 35	Backtrack
3, 10	15 < 35	Add next element
3, 10, 12	27 < 35	Select next element
3, 10, 12, 15	42 > 35	Backtrack
3, 10, 15	30 < 35	Select next element
3, 10, 15, 18	48 > 35	Backtrack
3, 10, 18	33 < 35	Select next element
3, 10, 18, 20	53 > 35	Backtrack
3, 10, 20	35	Solution is found

and every element needs to be analysed for required sum as the last, similarly if the last is the right computing time worst.

Initially subset = {}	sum = 0	
11	11 < 31	Add next element
11, 13	24 < 31	Add next element
11, 13, 24	48 > 31	Add next element
11, 13	24 < 31	Backtrack
11, 13, 7	31	Add 7
		Solution is found at {11, 13, 7}

The state space tree as shown in Fig. 6.5.3 -



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The sequence (ii) $W = \{20, 18, 15, 12, 10, 7, 5\}$ and (iii) $W = \{15, 7, 20, 5, 18, 10, 12\}$ are not in non-decreasing order. The (ii) sequence is in decreasing order and (iii) is totally unsorted.

Ex. 6.5.5 Draw a printed state space tree for a given sum of subset problem. $S = \{3, 4, 5, 6\}$ and $d = 13$

Sol.: Fig. 6.5.4 state space tree the total sum is given inside each node. Pruned nodes has cross at its bottom.

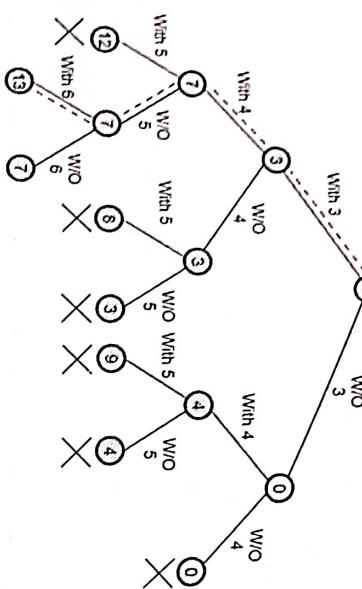


Fig. 6.5.4

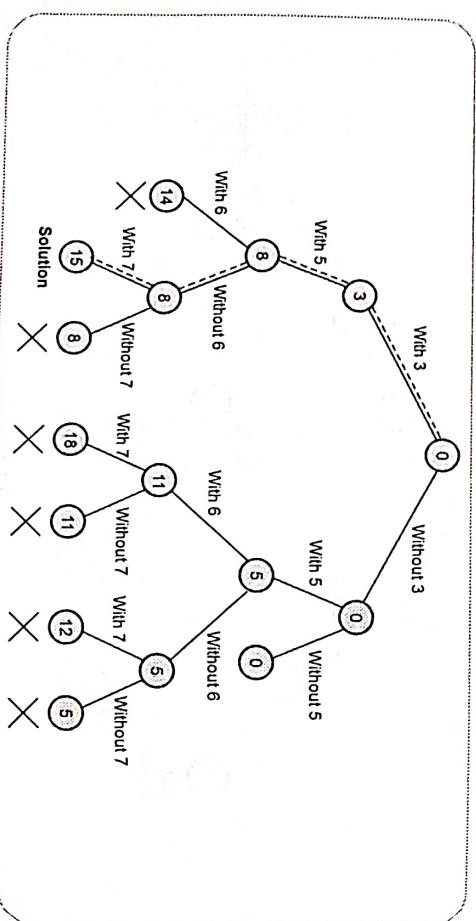
Hence the solution is $\{3, 4, 6\}$.

Ex. 6.5.6 Differentiate between backtracking and branch and bound. Draw state space tree for given sum of subset problem : Set of elements = $\{3, 5, 6, 7\}$ and $d = 15$

SPPU : Dec.-15, End Sem., Marks 8

Sol : Difference : (Refer section 7.1.1)

Following is a state space tree in which total sum is represented inside each node. Pruned node has a cross at its bottom. (Fig. 6.5.5)



The solution is $\{3, 5, 7\}$

Fig. 6.5.5 State space tree

Design and Analysis of Algorithm

Strategy to Solve Sum of Subsets Problem

Choose each number and sum it up. Compare it with the given sum d .

Backtracking

1. If the sum of chosen numbers is greater than d then remove the next subsequent element.
2. If the sum = d then declare the chosen set of numbers as the solution.
3. If another number in the set.
4. Thus all the permutations of the numbers for summing up should be attempted.
5. When we get the sum = d then declare the chosen set of numbers as the solution.

Review Question

- 0.1 Write a recursive backtracking algorithm for sum of subsets of problem.

SPPU : May-08, 10, 11, 17, Dec.-12, 13, Marks 12

6.6 Graph Coloring

Graph coloring is a problem of coloring each vertex in graph in such a way that no two adjacent

vertices have same color and yet m -colors are used. This problem is also called m -coloring problem. If the degree of given graph is d then we can color it with $d+1$ colors. The least number of colors needed to color the graph is called its chromatic number. For example : Consider a graph given in Fig 6.6.1.

As given in Fig. 6.6.1 we require three colors to color the graph. Hence the chromatic number of given graph is 3. We can use backtracking technique to solve the graph coloring problem as follows -

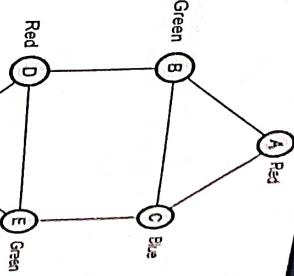
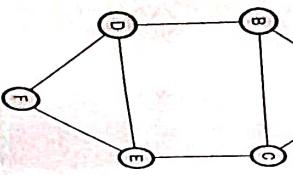


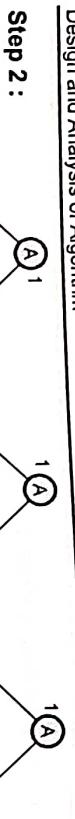
Fig. 6.6.1 Graph and its coloring

Step 1: A Graph G consists of vertices from A to F. There are three colors used Red, Green and Blue. We will number them out. That means 1 indicates Red, 2 indicates Green and 3 indicates Blue color.



Design and Analysis of Algorithm
we have assumed, color index Red = 1, Green = 2 and Blue = 3.

Algorithm



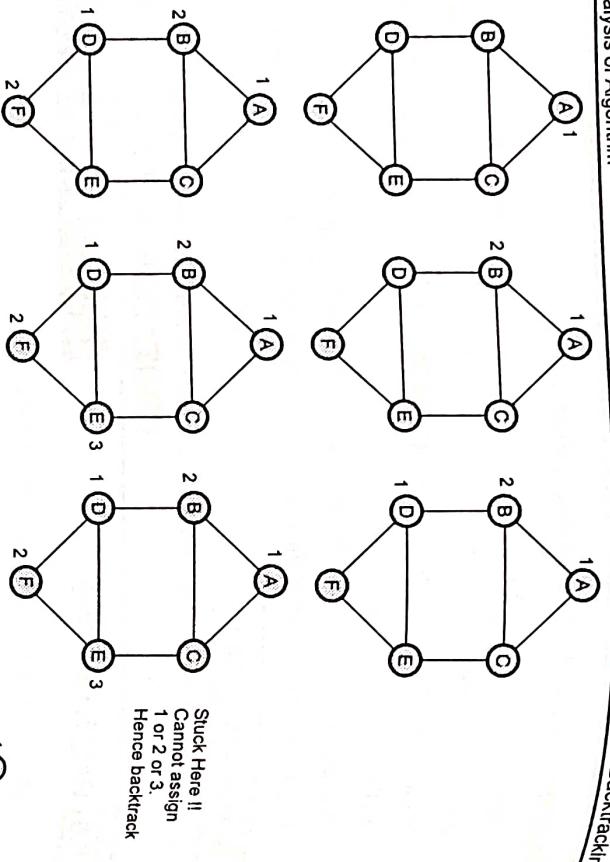
Backtracking

The algorithm for graph coloring uses an important function `Gen_Col_Value()` for generating `Gr_color(k)`.

```

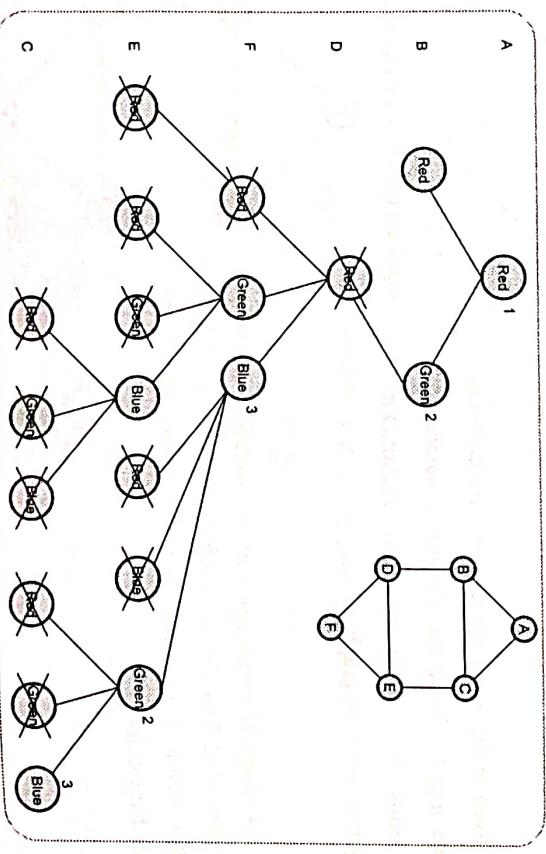
6.1
Algorithm
for graph G[1 : n, 1 : n] is given by adjacency matrix.
The graph is picked up one by one for coloring
Each vertex is assigned one of three colors.
// produces possible colors assigned
repeat
    // produces possible colors assigned
    Gen_Col_Value(k);
    if [k] = 0 then
        return; // Assignment of new color is not possible.
    if [k] <= n then // all vertices of the graph are colored
        write(x[1:n]); // print color index
    else
        G_color(k+1) // choose next vertex
    until(false);
}

```



Takes $O(nm)$ time

Step 3 : Thus the graph coloring problem is solved. The state-space tree can be drawn for better understanding of graph coloring technique using backtracking approach –



```

The algorithm used for assigning the color is given as below
Algorithm Gen_Col_Value(k)
    // [k] indicates the legal color assigned to the vertex
    // If no color exists then x[k] = 0
    {
        if [k] = 0 then
            return; // Assignment of new color is not possible.
        if [k] <= n then // all vertices of the graph are colored
            write(x[1:n]); // print color index
        else
            G_color(k+1) // choose next vertex
        until(false);
    }
}

```

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```

repeat
{
    if(x[k] = 0) then // no new color is remaining
        return;
    for(j=1 to n) do
    {
        // Taking care of having different colors for adjacent
        // vertices by using two conditions i) edge should be
        // present between two vertices
        // ii) adjacent vertices should not have same color
        if(G[i][j]=0) AND (x[k] x[j])) then
            break;
    }
    // If there is no new color remaining
    if(j=n+1) then
        return;
    juntil(false);
}

```

```

6.6.2 Analysis

The Gr_color takes computing time of  $\sum_{i=0}^{n-1} m^i$ . Hence total computing time for this
algorithm is  $O(m^n)$ .
If we trace the above algorithm then we can assign distinct colors to adjacent vertices. For
example : Consider, a graph given below can be solved using three colors.
Consider,
Red = 1, Green = 2 and Blue = 3.
The number inside the node indicates vertex number and the number outside the node
indicates color index.

function Gen_Col_Value(int k, int n)
{
    int j;
    int a,b;
    while(1)
    {
        a=color_tab[k]+1;
        b=n+1;
        color_tab[k] = a%b; // next highest color
        if(color_tab[k]==0) return; // all colors have been used
        for(j=1;j<=n;j++)
        {
            // check if this color is distinct from adjacent colors
            if(G[k][j] && color_tab[k]==color_tab[j])
                break;
        }
        if(j==n+1) return; // next new color found
    }
}

// such that adjacent vertices are assigned distinct integers
// k is the index of next vertex color.
void Gr_coloring(int k,int n)
{
    Gen_Col_Value(k,n);
    if(color_tab[k]==0) return; // No new color available
    if(k==n) return; // at most m colors have been
    else Gr_coloring(k+1,n); // used to color the n vertices
}

```


Hence we must arrange the given data in non-increasing order i.e.

$$P_i / W_i \geq P_{i+1} / W_{i+1}$$

- First of all we compute upper bound of the tree.
- We design a state space tree by inclusion or exclusion of some items.

The upper bound can be computed using following formula.

$$ub + (1 - (c - m)) / w_i * p_i$$

The algorithm for computing an upper bound is as given below -

```

1  Algorithm Bound_Calculation(cp,cw,k)
2  //Problem description : This algorithm
3  //calculates the upper bound, for each item
4  //Input : cp is the current profit, cw is the
5  //current weight and k is the index of just
6  //removed item
7  //Output : The upper bound value can be returned
8  ub <- cp
9  c <- cw
10 for (i < k+1 to n) do
11 {
12   c <- c+w[i]
13   if (c < m) then           //m is capacity of knapsack
14     ub <- ub + p[i]
15   else
16   {
17     ub <- ub + (1-(c-m)/w[i])*p[i]
18   }
19
20 return ub
21 }
```

This function is invoked by a Knapsack function Bk (k, cp, cw). The algorithm for the same is as given below.

Algorithm Bk (k, cp, cw)

```

1  //Problem description : This algorithm is to obtain
2  //solution for knapsack problem. Using this algorithm
3  //a state space tree can be generated.
```

Design and Analysis of Algorithm

Initially $k=1$, $cp=0$ and $cw=0$. The
 //input : represents the index of currently referred
 //item. The cp and cw represent the profit and
 //weights of items, so far selected.
 //Output : The set of selected items that are
 //satisfying the objective of knapsack problem.

```

0  if (cw+w[i] <= m) then
1  {
2    temp[i] <- 1           //temp array stores currently selected object
3    if (k < n) then
4      Bk(k+1, cp+p[i], cw+w[i])           //recursive call
5    if (cp+p[k] > final_profit) AND (k == n) then
6      if ((cp+p[k] > final_profit) AND (k == n)) then
7        final_profit <- cp + p[k]
8    final_wt <- cw + w[i]
9    for (j < 1 to k) then
10      x[i] <- temp[j]
11    }
12  }
13  if (Bound_calculation (cp,cw,k, final_profit) then
14    Generates left child
15  }
16  else
17  {
18    temp[k] <- 0
19    if (k < n) then
20      Bk(k+1, cp, cw)
21    if ((cp > final_profit) AND (k == n)) then
22    {
23      final_profit <- cp
24      final_wt <- cw
25    }
26  }
27  for (j < 1 to k) then
28    x[i] <- temp[j]
29  }
30 }
```

Finally get the solution

Invoke this function in order to obtain upper bound

Generates right child

Ex. 6.7.1 Obtain the optimal solution to the Knapsack problem $n = 3, m = 20$ (p_1, p_2, p_3) = (25, 24, 15) and (w_1, w_2, w_3) = (18, 15, 10).

SPPU : May-14, Marks 10

Sol.: Given that $n = 3$ and $m = \text{Capacity of Knapsack} = 20$.

We have

i	p[i]	w[i]	p[i] / w[i]
1	25	18	1.3
2	24	15	1.6
3	15	10	1.5

As we want $p[i] / w[i] \geq p[i+1] / w[i+1]$, let us rearrange the items as

i	p[i]	w[i]	p[i] / w[i]
1	24	15	1.6
2	15	10	1.5
3	25	18	1.3

Step 1 : Here we will trace knapsack backtracking algorithm using above values.

Initially set **final_profit** = -1

Bk(1, 0, 0)

\therefore

k = 1

cp = 0

cw = 0

Check if ($cw + w[k] <= m$)

i.e. if ($0 + w[1] = 0 + 15 <= 20$) \rightarrow yes

\therefore set temp[1] = 1

if ($k < n$) i.e. if ($1 < 3$)? \rightarrow yes

\therefore Bk (k + 1, cp + p[k], cw + w[k]) is called

Hence Bk (2, 0 + 24, 0 + 15) will be called. Refer line 14 of Algorithm Bk().

Step 2 :

k = 2

cp = 24

cw = 15

Check if ($cw + w[k] <= m$)

i.e. if ($15 + w[2] = 15 + 10 <= 20$) \rightarrow no

Hence we will calculate upper bound.

Step 5 : For calculating upper bound, initially set

$$\left. \begin{array}{l} ub = cp = 39 \\ c = cw = 25 \end{array} \right\} \text{Refer line 8 and 9}$$

of algorithm Bound_calculation

Set i = k + 1 i.e. 3 + 1 = 4 But i = 4 > n

Hence we will keep ub as it is

$$ub = 39$$

bound_calculation
Hence we will calculate ub i.e. upper bound.
for (i = k+1 to n) we will update upper bound value.

Consider i = k+1 = 3
c = c + w[i]

$$c = 15 + w[3]$$

$$c = 15 + 18 = 33$$

As $33 > 20$ i.e. exceeding the Knapsack capacity, we will compute ub as

$$ub = ub + (1 - (c = m) / w[i]) * p[i]$$

$$ub = 24 (1 - (15 - 20) / w[3]) * p[3]$$

$$= 24 + (1 - 5 / 18) * 25$$

$$ub = 30.94 \approx 31$$

As (ub > final_profit) i.e. $30.94 > -1$

Set temp[2] = 0

Now refer line 27 of Bk algorithm, a recursive call with k = 3 is made.

Step 4 :

k = 3

$$cp = 24 + p[2] = 24 + 15 = 39$$

$$cw = 15 + w[2] = 15 + 10 = 25$$

Check if ($cw + w[k] <= m$)

i.e. if ($25 + w[3] = 25 + 18 <= 20$) \rightarrow no

Hence we will calculate upper bound.

Step 5 : For calculating upper bound, initially set

$$\left. \begin{array}{l} ub = cp = 39 \\ c = cw = 25 \end{array} \right\} \text{Refer line 8 and 9}$$

of algorithm Bound_calculation

Set i = k + 1 i.e. 3 + 1 = 4 But i = 4 > n

Hence we will keep ub as it is

$$ub = 39$$

As $(39 > \text{final_profit})$ i.e. $39 > -1$

Set $\text{temp}[k] = \text{temp}[3] = 0$

Now $k = n = 3$ and $cp = 39 > \text{final_profit}$ (i.e. -1)

$\left. \begin{array}{l} \text{final_profit} = cp = 39 \\ \text{final_wt} = cw = 25 \end{array} \right\}$ Refer line 30 and 31
of algorithm Bk

Now copy all the contents of temp array to an array $x[]$. Refer line 32, 33 of Algorithm Bk.

Hence $x = \{1, 0, 0\}$ i.e. item 1 with weight = 15 and profit = 24 is selected.

The state space tree can be drawn as

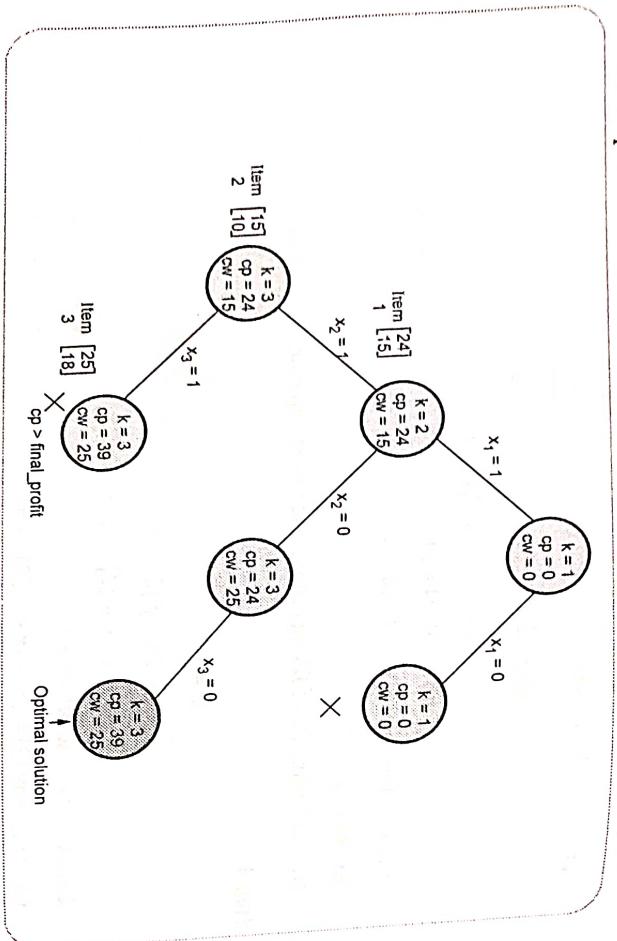


Fig. 6.7.1 State space tree for KnapSack

Here the left branch indicates inclusion of item and right branch indicates exclusion of items. Hence $x_1 = 1$ means 1st item selected and $x_2 = 0, x_3 = 0$ means 2nd and 3rd items are not selected. The state space tree can be created in DFS manner.

```

function Calculation(int cp,int cw,int k)
{
    int ub,c,i;
    ub=cp;c=cw;
    for(i=k+1;i<=n;i++)
    {
        c=c+wt[i];
        if(c<m)
            ub=ub+p[i];
    }
    if(cp>final_profit)
        return ub;
    else
        return(ub+(1-(c-m)/wt[i])*p[i]);
}

int new_k,new_cp,new_cw;
//Generate left child
if(cw+wt[k]<=m)
{
    temp[k]=1;
    if(k<n)
    {
        new_k=k+1;
        new_cp=cp+wt[k];
        new_cw=cw+wt[k];
        BK(new_k,new_cp,new_cw);
    }
}
if((new_cp>final_profit)&&(k==n))
{
    final_profit=new_cp;
    final_wt=new_cw;
    for(j=1;j<=k;j++)
        x[j]=temp[j];
}

```

Backtracking

```

    }
}

//Generate right child
if(Bound_Calculation(cp,cw,k) >= final_profit)
{
    temp[k]=0;
    if(k<n)
        BK(k+1,cp,cw);
    if((cp>final_profit)&&(k==n))
    {
        final_profit=cp;
        final_wt=cw;
        for(j=1;j<=n;j++)
            x[j]=temp[j];
    }
}

```

Ex. 6.7.2

Consider the following instance for knapsack problem using backtracking $n = 8$,
 $P = (11, 21, 31, 33, 43, 53, 55, 65)$ $W = (1, 11, 21, 23, 33, 43, 45, 55)$ $M = 110$.

SPPU: Dec-11, Marks 6, May-12, Marks 16

Sol.: We will arrange all the items in $\frac{P_i}{W_i} > \frac{P_{i+1}}{W_{i+1}} > \frac{P_{i+2}}{W_{i+3}} \dots$

The instance will be

Item	P_i	W_i	P_i/W_i
1	11	1	11
2	21	11	1.90
3	31	21	1.47
4	33	23	1.43
5	43	33	1.30
6	53	43	1.23
7	55	45	1.22
8	65	55	1.18

Design and Analysis of Algorithm
Let $M = 110$

Initially total-profit = -1
Initially total-weight = 0 We use formula as

$c^i = 0$, $c^W = 0$ $c^W = c^W + w[i]$ where i represents item number.

$$c^P = c^P + p[i], c^P = c^P + 11 = 0 + 11 = 11$$

$$c^W = c^W + 1 = 0 + 1 = 1 < M$$

$p[1] = 21$ $w[1] = 11$ $\therefore \text{select item 1}$
 $p[2] = 31$ $w[2] = 11$ $\therefore \text{select item 2}$
 $p[3] = 33$ $w[3] = 21$ $\therefore \text{select item 3}$
 $c^P = 32 + 31 = 63$
 $c^W = 12 + 21 = 33 < 110$

$p[4] = 33$ $w[4] = 23$ $\therefore \text{select item 4}$
 $c^P = 63 + 33 = 96$
 $c^W = 33 + 23 = 56 < 110$
 $p[5] = 43$ $w[5] = 33$ $\therefore \text{select item 5}$
 $c^P = 96 + 43 = 139$
 $c^W = 56 + 33 = 89 < 110$
 $p[6] = 53$ $w[6] = 43$ $\therefore \text{select item 6}$
 $c^P = 139 + 53 = 192$
 $c^W = 89 + 43 = 142 > 110$ $\therefore \text{not to select item 6}$

Upper bound will be,

$$11 + 31 + 33 + 43 + \left(\frac{110 - 89}{43}\right) * 53 = 164.89$$

But upper bound will exceed the capacity hence we will back track at item 4.
 Item 1, item 2, item 3, item 4 are selected. Thus upper bound will be calculated.

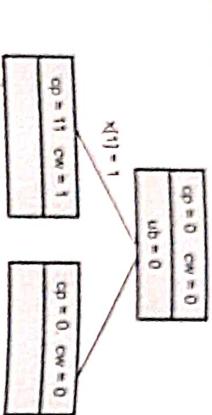


Fig. 6.7.2

Computation at node I

$$ub = cp + \left(\frac{m - cw}{W_{i+1}}\right) * P_{i+1}$$

$$ub = 11 + 21 + 31 + 33 + 43 + \left(\frac{110 - 89}{43}\right) * 53$$

$$ub = 164.88$$

Computation at node II

$$ub = 11 + 21 + 31 + 33 + 43 + \left(\frac{110 - 89}{43}\right) * 43$$

$$= 166.09$$

Computation at node III

$$ub = 11 + 21 + 31 + 43 + 53 + \left(\frac{110 - 109}{45}\right) * 55$$

$$ub = 160.22$$

- Review Question**
 Write an algorithm for 0/1 knapsack problem using backtracking method
 SPPU, May-15, 18, End Sem, Ques 4

Multiple Choice Questions

- A backtracking algorithm for problem instance might generate only _____
 a O(n) nodes
 b (n) nodes
 c n! nodes
 d 2^n nodes

- Q.1 In n-queen's problem when n=4 then how many leaf nodes exist?
 a 16
 b 64
 c 24
 d 32

- Q.3 _____ are those solutions state s for which the path from root to s defines the tuple that is a member of the set of solutions of the problem

- a Problem state
 b Answer state
 c Live nodes
 d None of the above

- Q.4 Following is a solution for 5 queen's problem

- a (1,2,5,3,4)
 b (1,2,3,4,5)
 c (5,4,3,2,1)
 d (1,3,5,2,4)

- Q.5 Following data structure is used for generating the solution using backtracking
 a Binary Tree
 b Heap
 c State Space Tree
 d B-Tree

Q. 6 The live node whose children are currently being expanded is called _____.

- a dead node b live node

- c E node d current node

Q. 7 The number of colors used for graph coloring equal to _____.

- a total number of vertices b total number of edges

- c half the number of total vertices d degree of graph plus one

Q. 8 The graph coloring problem can be efficiently solved using _____.

- a dynamic programming b greedy algorithm

- c backtracking d divide and conquer

Q. 9 A _____ is a generated node all of whose children have been generated.

- a dead node b live node

- c E node d None of the above

Q. 10 Backtracking needs _____ for implementation.

- a stack b queue c priority Queue d heap

Answer Keys for Multiple Choice Questions :

Q.1	a	Q.2	c	Q.3	b	Q.4	d	Q.5	c
Q.6	c	Q.7	d	Q.8	c	Q.9	a	Q.10	a

□□□