

UNIT V – BRANCH AND BOUND AND BACKTRACKING

Backtracking: N-Queens problem - Hamiltonian cycles – Graph coloring – Sum of subset. Branch and bound: The method – FIFO branch and bound- LC branch and bound – 0/1 Knapsack problem - Traveling salesman problem.

BRANCH AND BOUND

Branch and bound (BB, B&B, or BnB) is a method for solving optimization problems by breaking them down into smaller sub-problems and using a bounding function to eliminate sub-problems that cannot contain the optimal solution. It is an algorithm design paradigm for discrete and combinatorial optimization problems, as well as mathematical optimization. A branch-and-bound algorithm consists of a systematic enumeration of candidate solutions by means of state space search: the set of candidate solutions is thought of as forming a rooted tree with the full set at the root. The algorithm explores branches of this tree, which represent subsets of the solution set. Before enumerating the candidate solutions of a branch, the branch is checked against upper and lower estimated bounds on the optimal solution, and is discarded if it cannot produce a better solution than the best one found so far by the algorithm.

The Branch and Bound Algorithm is a method used in combinatorial optimization problems to systematically search for the best solution. It works by dividing the problem into smaller subproblems, or branches, and then eliminating certain branches based on bounds on the optimal solution. This process continues until the best solution is found or all branches have been explored. Branch and Bound is commonly used in problems like the traveling salesman and job scheduling.

Different search techniques in branch and bound:

The Branch algorithms incorporate different search techniques to traverse a state space tree. Different search techniques used in B&B are listed below:

1. LC search
2. BFS
3. DFS

1. LC search (Least Cost Search):

It uses a heuristic cost function to compute the bound values at each node. Nodes are added to the list of live nodes as soon as they get generated.

The node with the least value of a cost function selected as a next E-node.

2.BFS(Breadth First Search):

It is also known as a FIFO search.

It maintains the list of live nodes in first-in-first-out order i.e, in a queue, The live nodes are searched in the FIFO order to make them next E-nodes.

3. DFS (Depth First Search):

It is also known as a LIFO search.

It maintains the list of live nodes in last-in-first-out order i.e. in a stack.

The live nodes are searched in the LIFO order to make them next E-nodes.

When to apply Branch and Bound Algorithms?

Branch and bound is an effective solution to some problems, which we have already discussed. We'll discuss all such cases where branching and binding are appropriate in this section.

- It is appropriate to use a branch and bound approach if the given problem is discrete optimization. Discrete optimization refers to problems in which the variables belong to the discrete set. Examples of such problems include 0-1 Integer Programming and Network Flow problems.
- When it comes to combinatorial optimization problems, branch and bound work well. An optimization problem is optimized by combinatorial optimization by finding its maximum or minimum based on its objective function. The combinatorial optimization problems include Boolean Satisfiability and Integer Linear Programming.

Basic Concepts of Branch and Bound:

- **Generation of a state space tree:**

As in the case of backtracking, B&B generates a state space tree to efficiently search the solution space of a given problem instance.

In B&B, all children of an E-node in a state space tree are produced before any live node gets converted to an E-node. Thus, the E-node remains an E-node until it becomes a dead node.

- **Evaluation of a candidate solution:**

Unlike backtracking, B&B needs additional factors evaluate a candidate solution:

1. A way to assign a bound on the best values of the given criterion functions to each node in a state space tree: It is produced by the addition of further components to the partial solution given by that node.
 2. The best values of a given criterion function obtained so far: It describes the upper bound for the maximization problem and the lower bound for the minimization problem.
- A feasible solution is defined by the problem states that satisfy all the given constraints.
 - An **optimal solution** is a feasible solution, which produces the best value of a given objective function.
 - **Bounding function** : It optimizes the search for a solution vector in the solution space of a given problem instance. It is a heuristic function that evaluates the lower and

upper bounds on the possible solutions at each node. The bound values are used to search the partial solutions leading to an optimal solution. If a node does not produce a solution better than the best solution obtained thus far, then it is abandoned without further exploration.

Classification of Branch and Bound Problems:

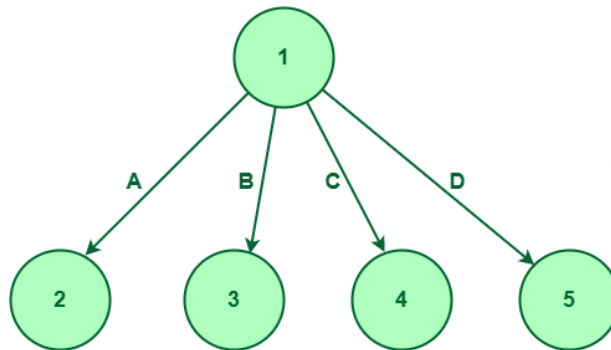
The Branch and Bound method can be classified into three types based on the order in which the state space tree is searched.

1. FIFO Branch and Bound
2. LIFO Branch and Bound
3. Least Cost-Branch and Bound

1. FIFO Branch and Bound

First-In-First-Out is an approach to the branch and bound problem that uses the queue approach to create a state-space tree. In this case, the breadth-first search is performed, that is, the elements at a certain level are all searched, and then the elements at the next level are searched, starting with the first child of the first node at the previous level.

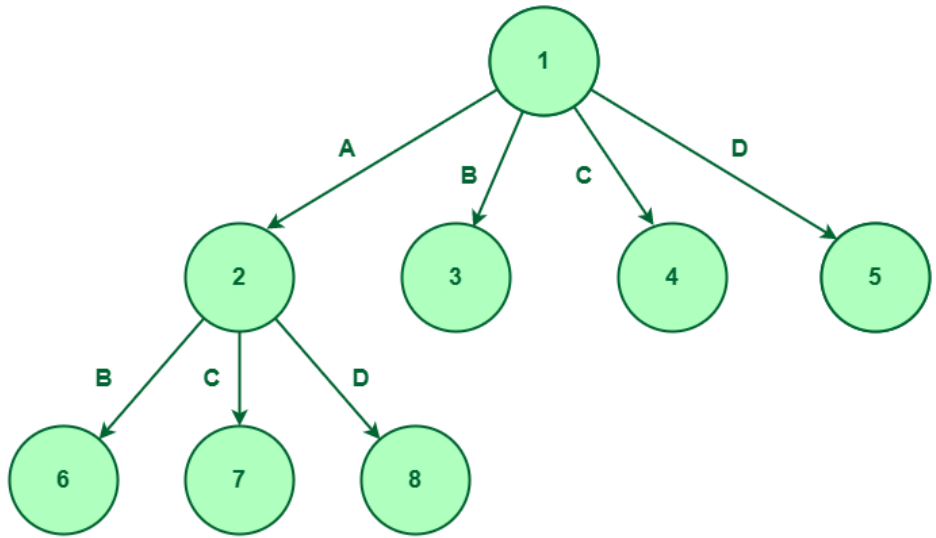
For a given set $\{A, B, C, D\}$, the state space tree will be constructed as follows :



State Space tree for set $\{A, B, C, D\}$

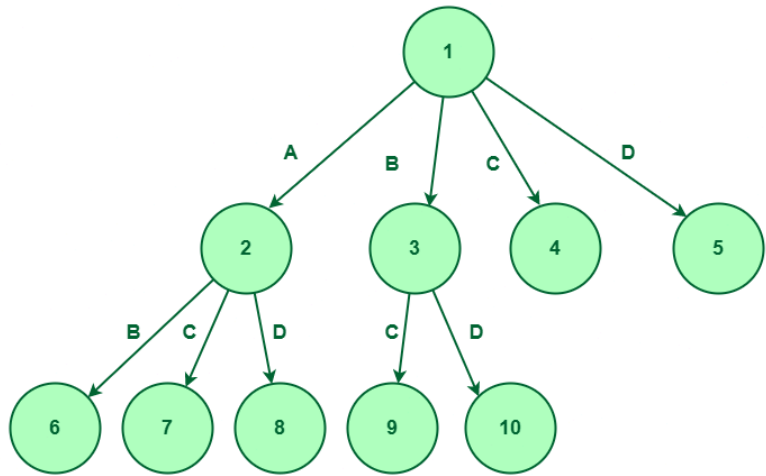
The above diagram shows that we first consider element A, then element B, then element C and finally we'll consider the last element which is D. We are performing BFS while exploring the nodes.

So, once the first level is completed. We'll consider the first element, then we can consider either B, C, or D. If we follow the route then it says that we are doing elements A and D so we will not consider elements B and C. If we select the elements A and D only, then it says that we are selecting elements A and D and we are not considering elements B and C.



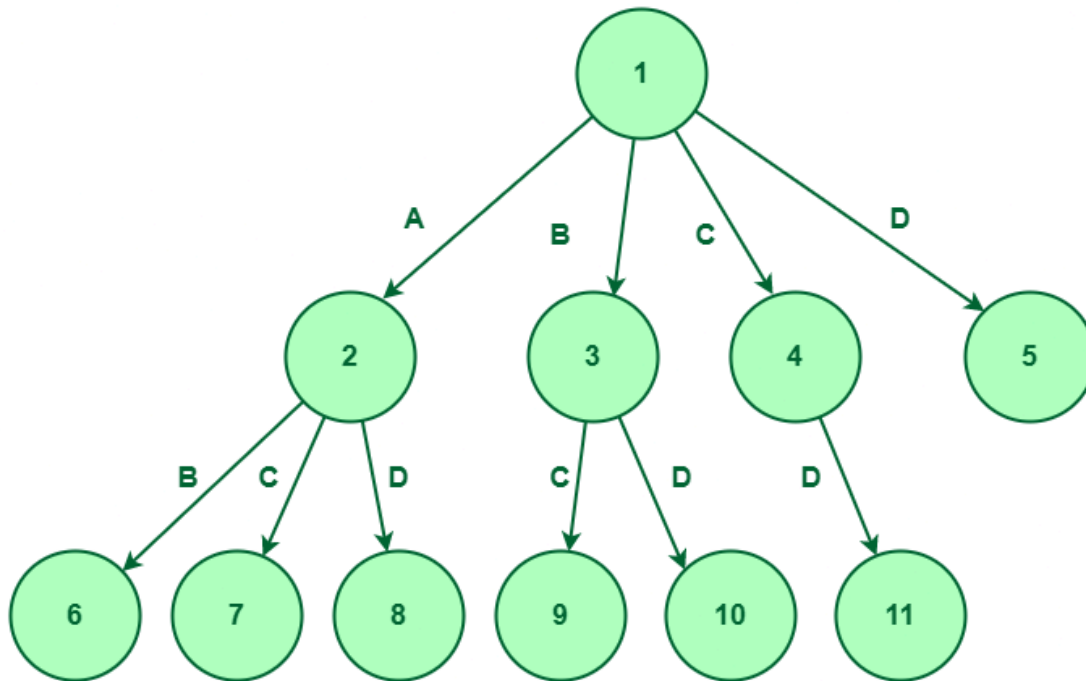
Selecting element A

Now, we will expand node 3, as we have considered element B and not considered element A, so, we have two options to explore that are elements C and D. Let's create nodes 9 and 10 for elements C and D respectively.



Considered element B and not considered element A

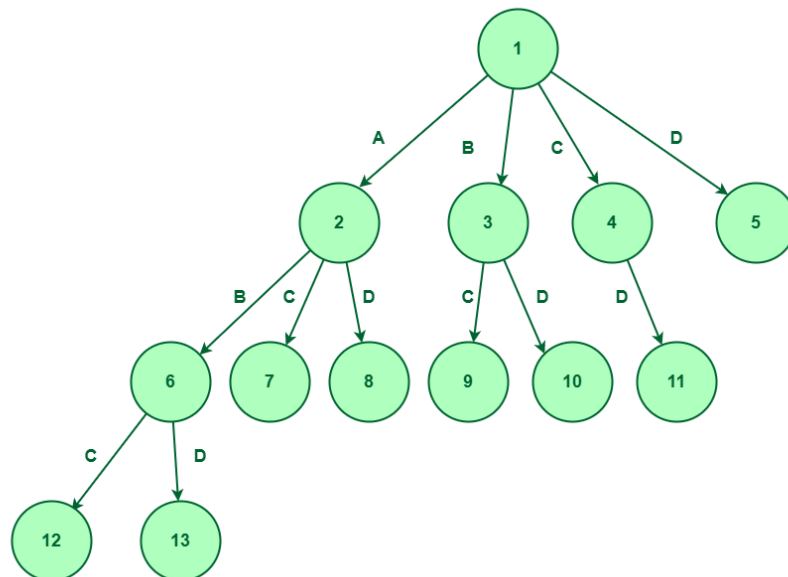
Now, we will expand node 4 as we have only considered elements C and not considered elements A and B, so, we have only one option to explore which is element D. Let's create node 11 for D.



Considered elements C and not considered elements A and B

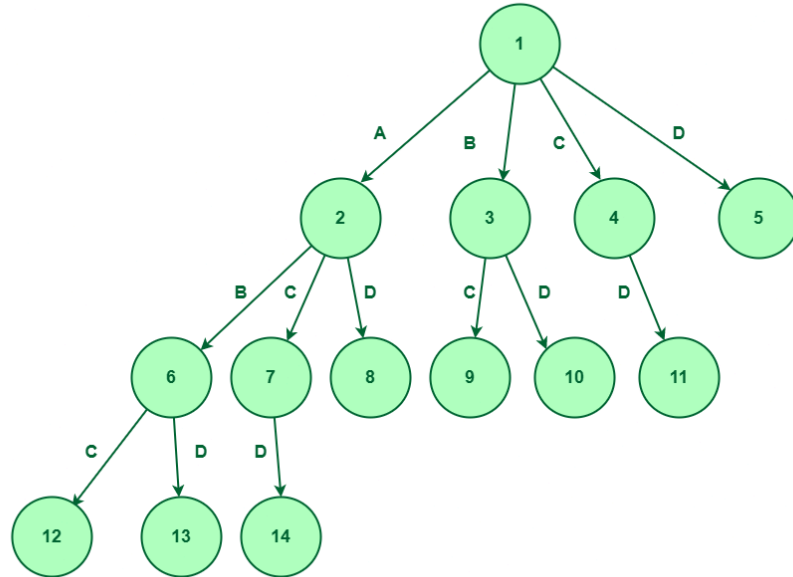
Till node 5, we have only considered elements D, and not selected elements A, B, and C. So, We have no more elements to explore, Therefore on node 5, there won't be any expansion.

Now, we will expand node 6 as we have considered elements A and B, so, we have only two options to explore that is element C and D. Let's create node 12 and 13 for C and D respectively.



Expand node 6

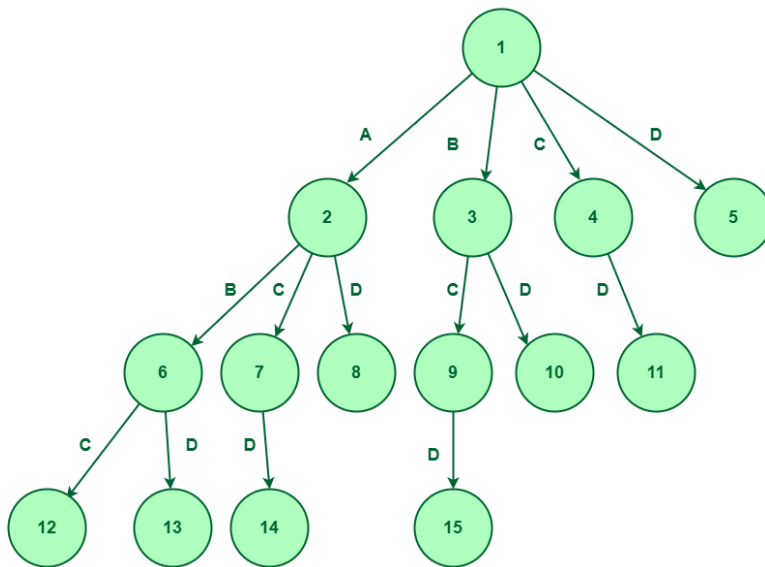
Now, we will expand node 7 as we have considered elements A and C and not consider element B, so, we have only one option to explore which is element D. Let's create node 14 for D.



Expand node 7

Till node 8, we have considered elements A and D, and not selected elements B and C, So, We have no more elements to explore, Therefore on node 8, there won't be any expansion.

Now, we will expand node 9 as we have considered elements B and C and not considered element A, so, we have only one option to explore which is element D. Let's create node 15 for D.

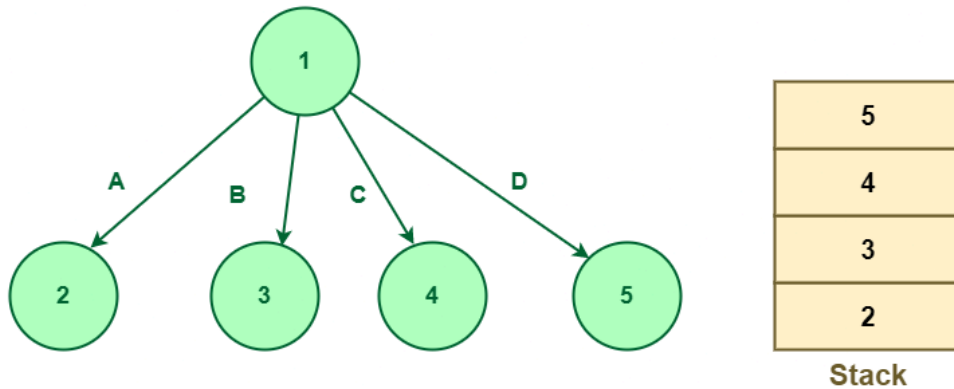


Expand node 9

2. LIFO Branch and Bound

The Last-In-First-Out approach for this problem uses stack in creating the state space tree. When nodes are added to a state space tree, they are added to a stack. After all nodes of a level have been added, we pop the topmost element from the stack and explore it.

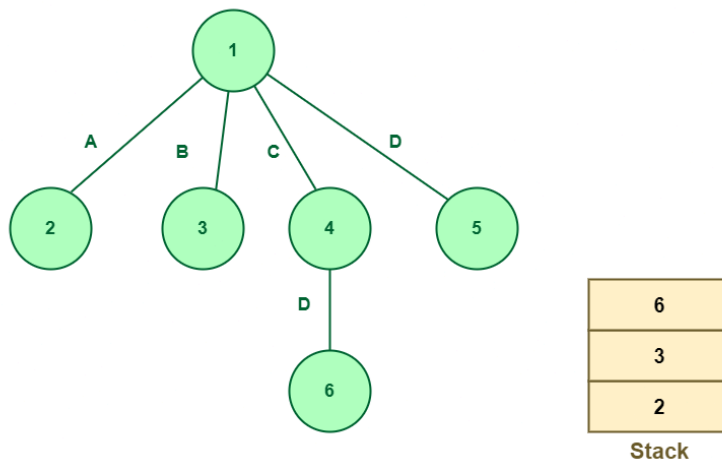
For a given set $\{A, B, C, D\}$, the state space tree will be constructed as follows :



State space tree for element $\{A, B, C, D\}$

Now the expansion would be based on the node that appears on the top of the stack. Since node 5 appears on the top of the stack, so we will expand node 5. We will pop out node 5 from the stack. Since node 5 is in the last element, i.e., D so there is no further scope for expansion.

The next node that appears on the top of the stack is node 4. Pop-out node 4 and expand. On expansion, element D will be considered and node 6 will be added to the stack shown below:

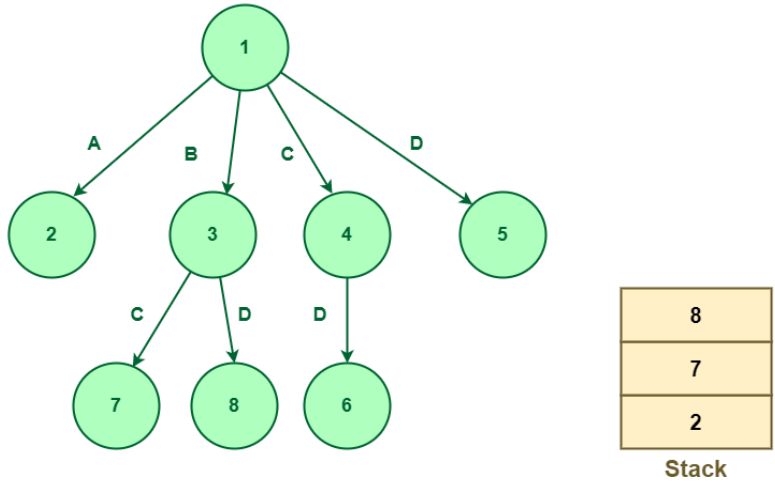


Expand node 4

The next node is 6 which is to be expanded. Pop-out node 6 and expand. Since node 6 is in the last element, i.e., D so there is no further scope for expansion.

The next node to be expanded is node 3. Since node 3 works on element B so node 3 will be expanded to two nodes, i.e., 7 and 8 working on elements C and D respectively. Nodes 7 and 8 will be pushed into the stack.

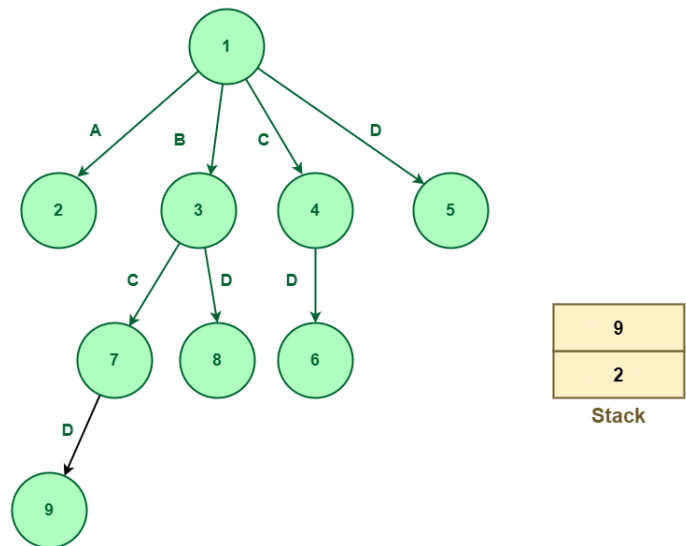
The next node that appears on the top of the stack is node 8. Pop-out node 8 and expand. Since node 8 works on element D so there is no further scope for the expansion.



Expand node 3

The next node that appears on the top of the stack is node 7. Pop-out node 7 and expand. Since node 7 works on element C so node 7 will be further expanded to node 9 which works on element D and node 9 will be pushed into the stack.

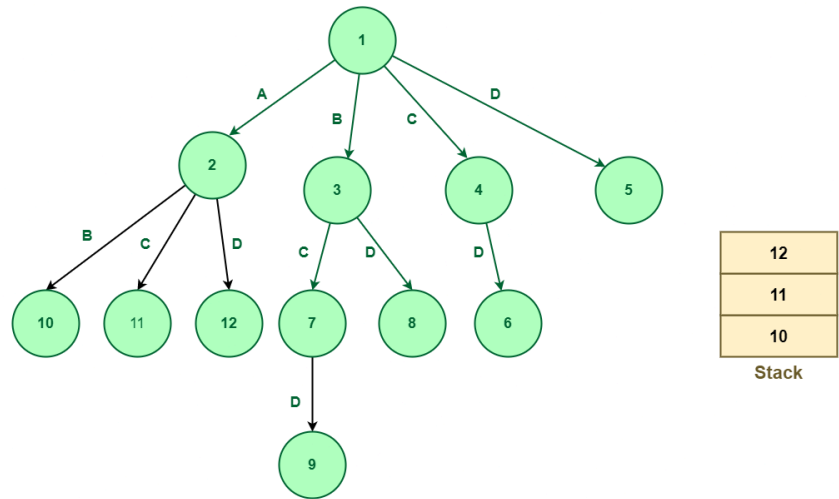
The next node is 6 which is to be expanded. Pop-out node 6 and expand. Since node 6 is in the last element, i.e., D so there is no further scope for expansion.



Expand node 7

The next node that appears on the top of the stack is node 9. Since node 9 works on element D, there is no further scope for expansion.

The next node that appears on the top of the stack is node 2. Since node 2 works on the element A so it means that node 2 can be further expanded. It can be expanded up to three nodes named 10, 11, 12 working on elements B, C, and D respectively. There new nodes will be pushed into the stack shown as below:



Expand node 2

In the above method, we explored all the nodes using the stack that follows the LIFO principle.

3. Least Cost-Branch and Bound

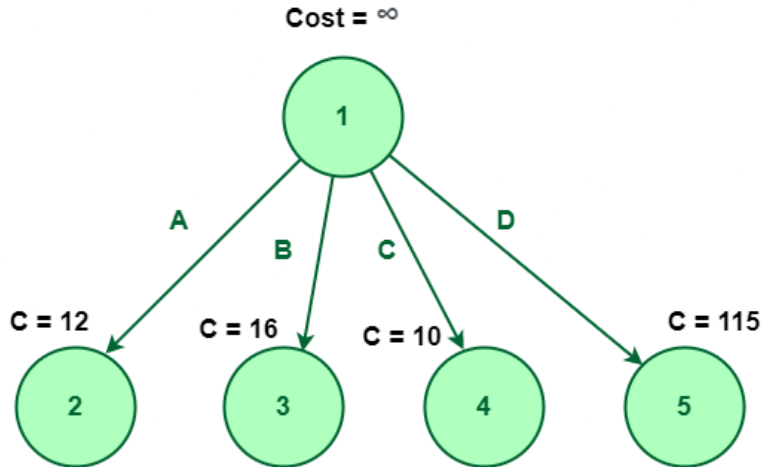
To explore the state space tree, this method uses the cost function. The previous two methods also calculate the cost function at each node but the cost is not used for further exploration.

In this technique, nodes are explored based on their costs, the cost of the node can be defined using the problem and with the help of the given problem, we can define the cost function. Once the cost function is defined, we can define the cost of the node.

Now, Consider a node whose cost has been determined. If this value is greater than U_0 , this node or its children will not be able to give a solution. As a result, we can kill this node and not explore its further branches. As a result, this method prevents us from exploring cases that are not worth it, which makes it more efficient for us.

Let's first consider node 1 having cost infinity shown below:

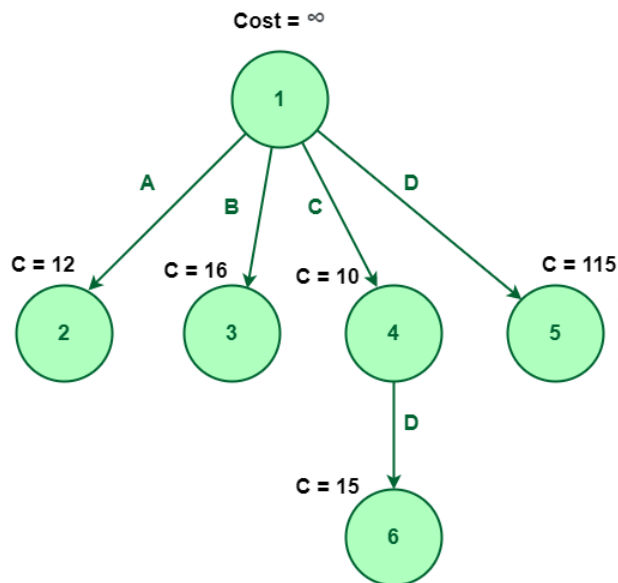
In the following diagram, node 1 is expanded into four nodes named 2, 3, 4, and 5.



Node 1 is expanded into four nodes named 2, 3, 4, and 5

Assume that the cost of the nodes 2, 3, 4, and 5 are 12, 16, 10, and 115 respectively. In this method, we will explore the node which has the least cost. In the above figure, we can observe that the node with a minimum cost is node 4. So, we will explore node 4 having a cost of 10.

During exploring node 4 which is element C, we can notice that there is only one possible element that remains unexplored which is D (i.e, we already decided not to select elements A, and B). So, it will get expanded to one single element D, let's say this node number is 6.



Exploring node 4 which is element C

Now, Node 6 has no element left to explore. So, there is no further scope for expansion. Hence the element {C, D} is the optimal way to choose for the least cost.
