

## BRANCH AND BOUND

This method is generally applied to optimization problem ie maximization (knapsack) problem or minimization problem (TSP).  
only

In this method a state space tree of all possible solutions is generated.

Then partitioning or branching is done at each node of the tree.

Then compare the node's bound value with the value of the best solution obtained up to now ie current state

If the bound value of some node is better than the best solution then that node is not expanded. It is also called branch pruned here

After computation of bounding value at each node, we compare it with best solution & then expanding the node further can lead to a final solution node.

The branching procedure replaces an original problem by a set of new problems that are:

- Mutually exclusive and exhaustive sub problems of the original problem
- Partially solved version of the original problem.
- smaller problems than original problem.

There are various reasons for terminating search path in state space tree of branch + bound.

- The value of the node's bound is not better

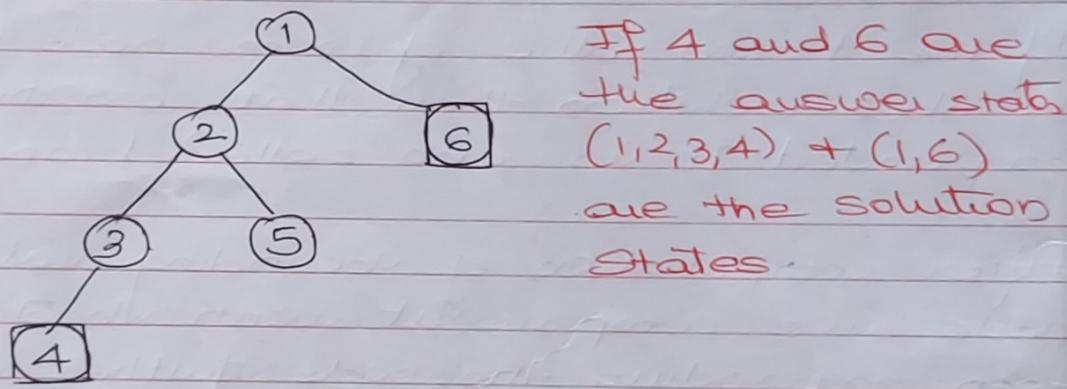
than the best solution

- There is no feasible sol<sup>n</sup>
- A new better sol<sup>n</sup> can be obtained rather than continuing further.

## Terminology

### Answer Node

Those solution states S for which path from root to S defines a tuples which is a member of the set of solutions (ie it satisfies the implicit constraints) of the problem.



### Live Node

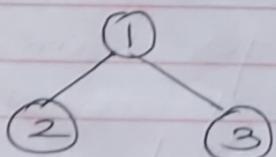
A node which has been generated and all of those children have not yet been generated is live node.

Step 1

①

Here 1 is a live node since children of 1 not yet been generated.

Step 2

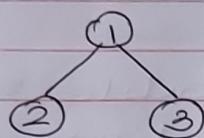


Here 2 & 3 are live node But node 1 is not live since all the children of 1 are generated.

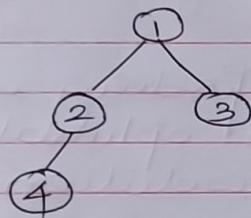
### E-node

The live node whose children are currently being generated is called the E-node (node being expanded)

- ① Here 1 is a live node. And its children are currently being expanded. So 1 is the E-node.



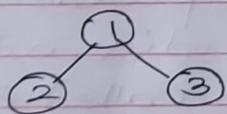
Here 1 is a live node. And its children are currently being expanded. So 1 is the E-node.



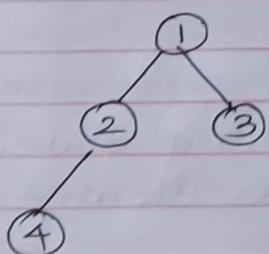
Here 2 & 3 are live nodes. And 2's children are currently being expanded. So 2 is the E-node.

### Dead Node

It is generated node that is either not to be expanded further or one for which all of its children have been generated.



Here 1 is already expanded. Assume 2 & 3 are not expanded. Then 1, 2, 3 are dead nodes.



Here 1 is already expanded. And 2's children are currently being expanded. So it is E-node. Assume that 3 & 4 are not expanded. Then 1, 3 & 4 are dead node.

Generally three types of searching strategies used in branch and bound

- 1) FIFO (First In First Out)
- 2) LIFO (Last In First Out)
- 3) LC (Least Count) Search

Branch and Bound requires two tools.

- a) Way of covering the feasible solution by smaller feasible solution called BRANCHING - we are exploring all sol's.
- b) BOUNDING is a way of finding upper and lower bound for the optimal sol' within a feasible sub solution.  
When bounding we are eliminating least feasible solutions

If the lower bound of a sub problem A from the search tree is greater than the upper bound for any other previously examined sub problem B, then A may be safely discarded from the search. This is called PRUNING

### FIFO (First In First Out) Search.

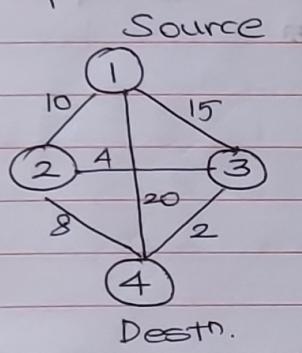
- Breadth first search with queue based Branch & Bound is called FIFO Branch & Bound State space tree using BFS
- In the FIFO search, the children of the

root node are generated in the first iteration  
In the next step, children of the root node are generated.

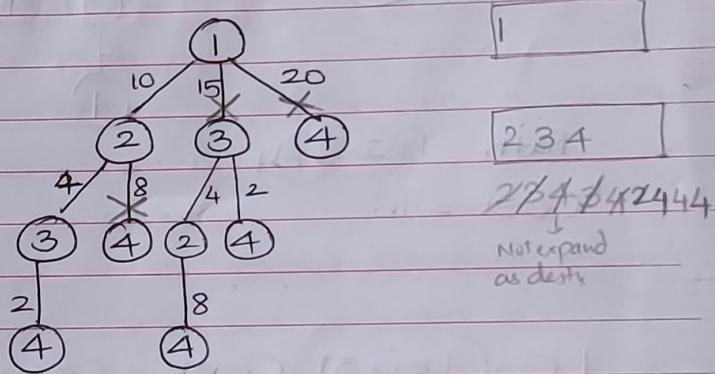
If the children not already killed by bounding function then put it in the queue. Then the children of second child is explored.

Put all the children in the queue except for those children which are killed.

Example:



To traverse from Source to Dest?



Therefore the path: 1-2-3-4

$$\text{Cost : } 10 + 4 + 2 = 16$$

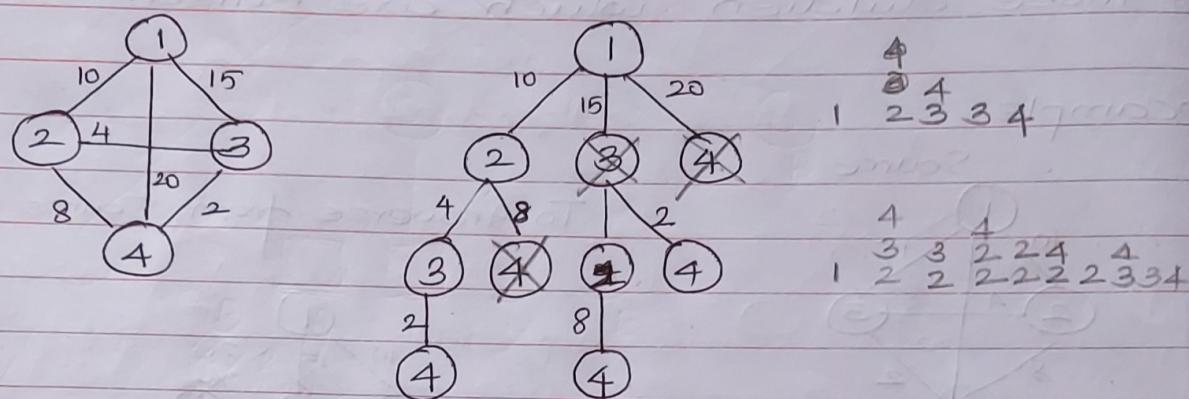
### LIFO (Last In First Out) Search

DFS with stack based Branch + Bound is called LIFO Branch + Bound

- In LIFO search the children of the root node are generated in the first iteration
- In the next step, children of the root node are generated in the first iteration child is generated.

If the children not already killed by  
bounding function then put it in the  
stack. Then the children of second  
child is explored.

- Put all the children in the stock except for those children which are killed.



Path: 1-2-3-4

$$\text{Cost} = 16$$

## LC (Least Cost Search)

- In both FIFO & LIFO Branch & Bound, the selection rule for the next E-node is fixed
  - The rigid selection rule does not give any preference to a node which best and can search the answer node quickly
  - The search for an answer node can be speeded up by using a ranking function for live nodes.
  - The next E-node is selected on the basis of this ranking function.

The ideal way to assign ranks would be on the basis of additional computational effort needed to reach the answer node from the live node.

for any node  $x$ , this cost could be:

- The number of nodes in the subtree  $x$  that needed to be generated before an answer node is generated
- The no. of levels the nearest answer node is from ' $x$ '.

The ranking function is

$$c(x) = f(x) + g(x)$$

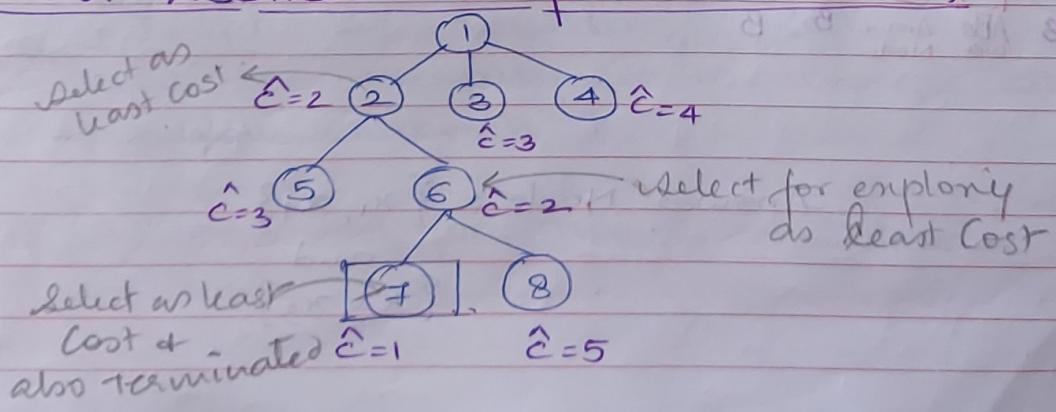
where  $c(x)$  is the cost of  $x$

$f(x)$  is the cost of reaching  $x$  from root & is non-decreasing

$g(x)$  is an estimate of the additional effort needed to reach an answer node  $x$ .

To select the next E-node would always choose for its next E-node a live node with least  $c(x)$

### Control Abstractions for LC Search



## Example

Solve of subset

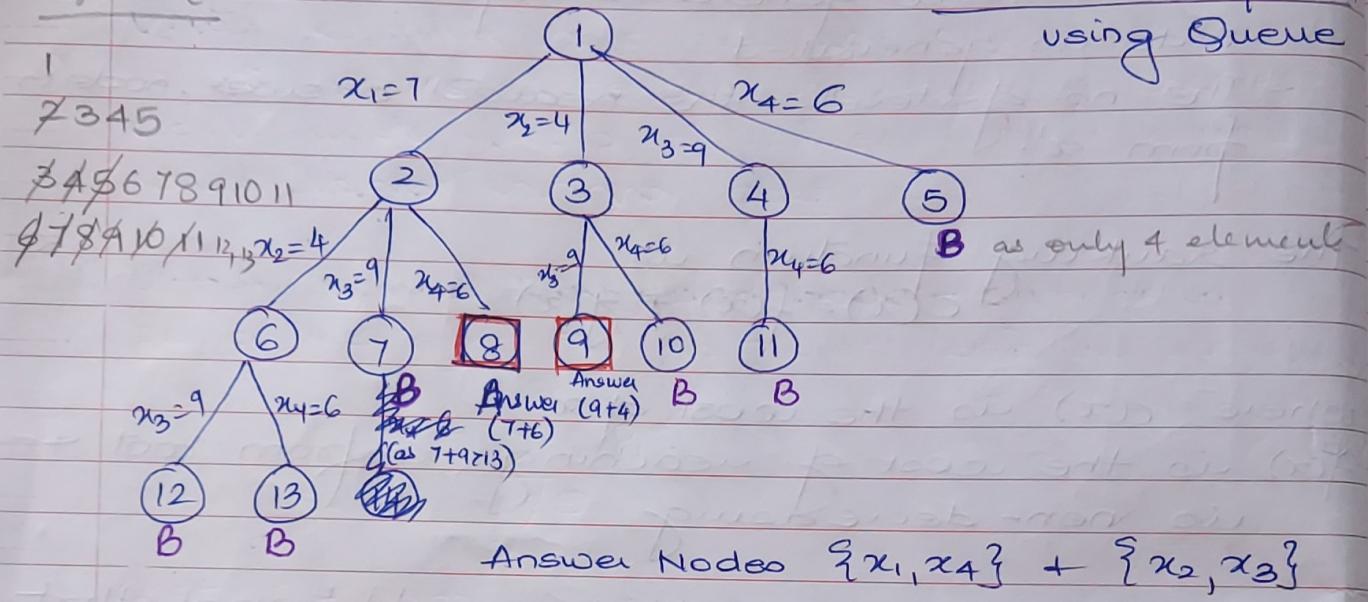
$$M = \{1, 2, 3\}$$

$$n = 4, \quad w_1, w_2, w_3, w_4 = (7, 4, 9, 6)$$

Queue

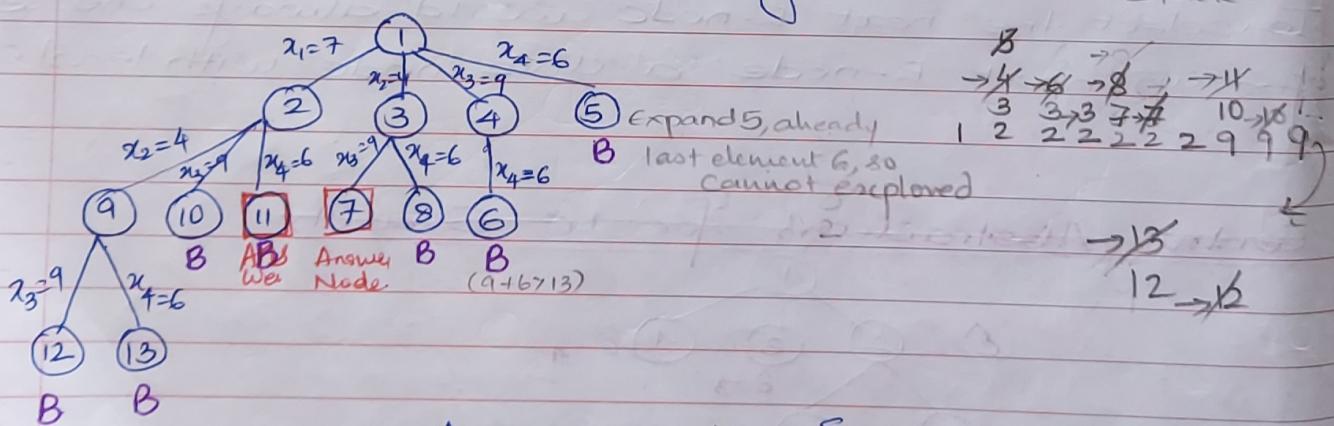
FIFO Branch & Bound

using Queue



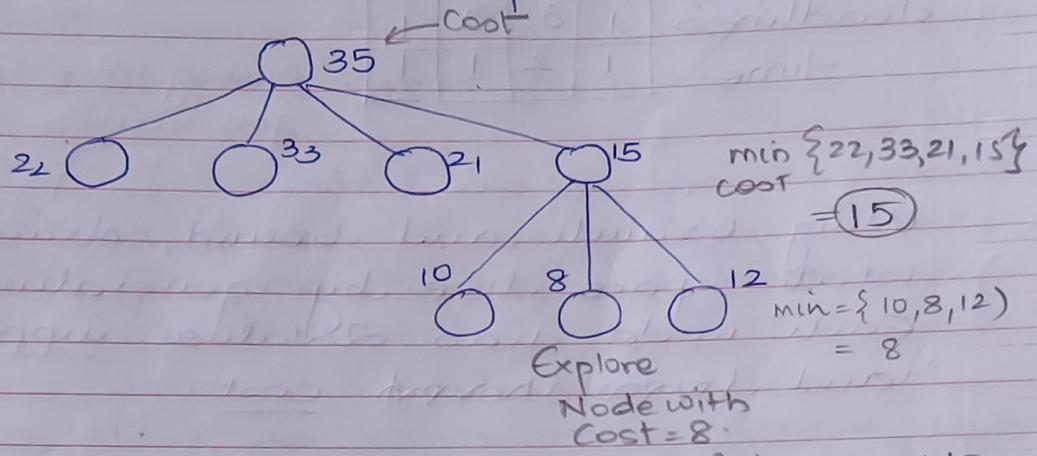
LIFO Branch & Bound using Stack.

Stack:



head Count Search. B/B (Priority Queue)

Consider the below state space tree



For Control Abstraction using LC Search Refer DAA Notes pdf.  
Job sequencing with deadlines

Given  $n$  jobs and 1 processor

Each job  $j_i$  has a 3-tuple associated with it represented by  $(p_i, d_i, t_i)$

- Job  $j_i$  requires  $t_i$  units of processing time
- If processing is not completed by deadline  $d_i$ , a penalty  $p_i$  is incurred.

Objective is to select a subset  $J$  of  $n$  jobs such that all jobs in  $J$  can be completed by their deadline.

- A penalty will incur only on jobs not in  $J$ .
- For optimal solution,  $J$  should be such that the penalty is minimized among all possible subsets  $J$ .

$B/B \rightarrow$  Used for minimization problem

problems

	J <sub>1</sub>	J <sub>2</sub>	J <sub>3</sub>	J <sub>4</sub>
Penalty	5	10	6	3
deadlines	1	3	2	1
time	1	2	1	1

minimizes penalty

Ant q time taken for compl job varies.

Using branch and bound, draw the state space tree by generating nodes. Each node has 2 values upper bound and lower bound cost.

Upper bound for each node - sum of all penalties except that included in solution

8

$$U = \sum_{i \notin S} P_i$$

Cost,  $\hat{C}$  = sum of penalties till the <sup>last</sup> job considered

$$\hat{C} = \sum_{i \in S_K} P_i$$

upto last K<sup>th</sup> job

when J<sub>1</sub> is the solution  
only one considered

① 50,

$$U = 10 + 6 + 3 = 19$$

$$\hat{C} = 0$$

Now upper value  
 $< \infty$ , so update upper

$\hat{C} = 0$

J<sub>1</sub>, J<sub>2</sub> considered

so cost = 0

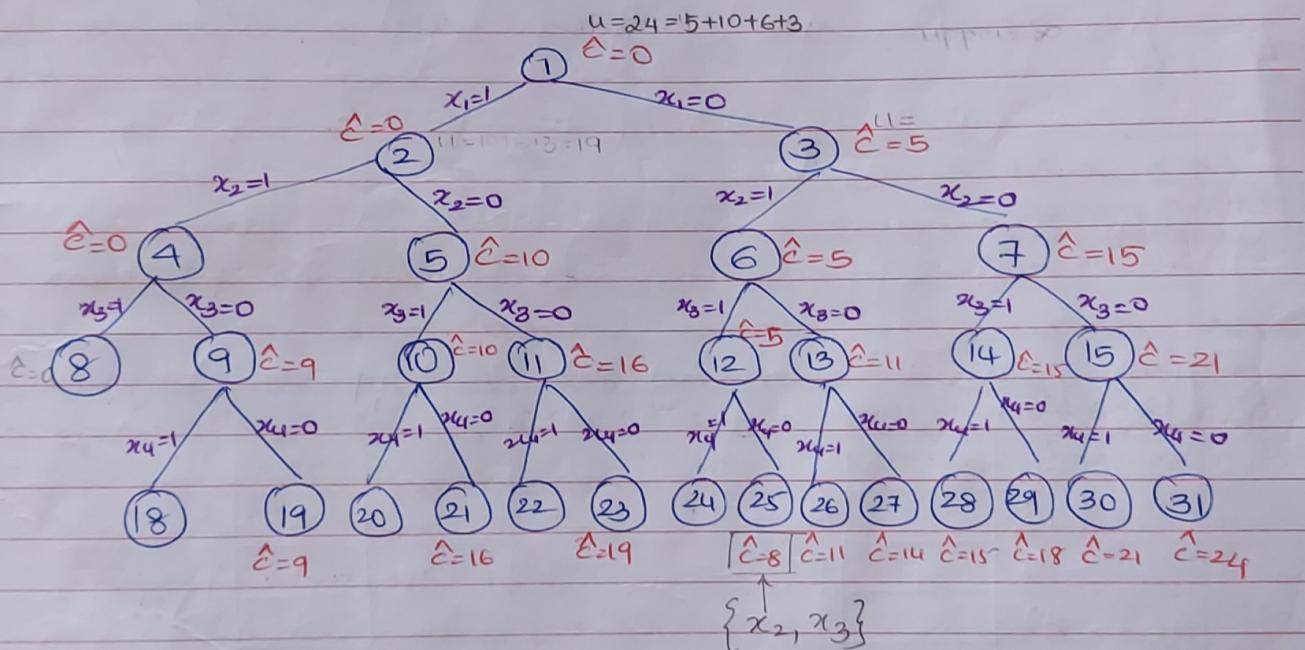
J<sub>3</sub>, J<sub>4</sub> Inf

J<sub>3</sub>

## Fixed size tuple formulation

In fixed tuple size wif,  $x_i=1$  means job  $i$  is selected  $x_i=0$  means job  $i$  is not selected for formulation of J (the optimal subset).

Initially  $\hat{c}=0$  for node 1 as no job is selected. For node 3, it indicates omission of job 1. Hence penalty is 5. For node 5 there is omission of job 2. Hence  $\hat{c} = \text{penalty} = 10$ . For node 7 there is omission of job 1 and job 2. Hence  $\hat{c}=15$ . For node 13 there is omission of job 1 + job 3. Hence penalty is 11. Therefore  $\hat{c}=11$ . Continuing in this way  $\hat{c}$  is computed.



Min penalty = 8

## O/I Knapsack problem using Branch & bound.

There are  $n$  objects and the capacity of the knapsack is  $M$ . We have to select some objects from ' $n$ ' objects in such a way that it should not exceed the capacity of the knapsack ' $M$ ' and the maximum profit can be earned.

So, the knapsack is maximization problem. But branch and bound deals only with minimization problem so we

Let  $M$  be the capacity. ' $n$ ' objects are placed in the knapsack whose weights are  $w_1, w_2, \dots, w_n$  resp. such sum of weights of objects  $\leq$  capacity of knapsack giving maximize profit

i.e. maximize  $\sum_{i=1}^n p_i x_i$  such that  $\sum_{i=1}^n w_i x_i \leq M$ .

here  $x_i = 0/1$  (So O/I knapsack is max. problem)

But branch and bound deals only with minimization problem. So, we modify the given knapsack problem to be minimization problem.

The modified problem is

$$\min Z = -p_1 x_1 - p_2 x_2 - \dots - p_n x_n$$

The constraints are  $w_1 x_1 + w_2 x_2 + \dots + w_n x_n \leq M$ .

and  $x_i = 0 \text{ or } 1$

In Branch and bound, we calculate the lower bound and upper bound for each and every node in state space tree.

In lower bound, fractions are allowed whereas in upper bound fractions are not allowed.

## Algorithm for LC Branch & Bound

- 1) Draw a state space tree and set upper =  $\infty$
  - 2) Compute  $\hat{c}(x)$ ,  $\hat{u}(x)$  for each node
  - 3)  $\hat{U}(x) = -\sum P_i$
- $\hat{c}(x) = u(x) - \frac{[m - \text{current total weight}] * [\text{actual profit of remaining obj}]}{[\text{actual weight of remaining obj}]}$
- 4) If  $u(x)$  is min then upper will set to  $u(x)$
  - 5) If  $\hat{c}(x) > \text{upper}$  kill node  $x$
  - 6) Otherwise the min. cost  $\hat{c}(x)$  becomes E-node & generate children for E-node
  - 7) Repeat steps 2 to 6 until all the nodes get covered
  - 8) The minimum cost  $\hat{c}(x)$  becomes the answer node.

Trace the path in backward direction from  $x$  to root for solution set.

## Algorithm D1 Knapsack- FIFO B & B

- 1) Draw a state space tree & set upper =  $\infty$
  - 2) Compute  $\hat{c}(x)$ ,  $\hat{u}(x)$  for each node
  - 3)  $\hat{U}(x) = -\sum P_i$
- $\hat{c}(x) = u(x) - \frac{[m - \text{current total weight}] * [\text{actual profit of rem. obj}]}{[\text{actual weight of remaining object}]}$
- 4) If  $u(x)$  is min then upper will set to  $u(x)$
  - 5) If  $\hat{c}(x) > \text{upper}$ , Kill node  $x$
  - 6) Next live node becomes E-node & generate children for E-node
  - 7) Repeat 2 to 6 until all the nodes get covered
  - 8) The min. cost  $\hat{c}(x)$  becomes the answer node.
- Trace the path in backward direction from  $x$  to root for solution subset.

## Differences betn Backtracking and B&B.

### Backtracking

i) In backtracking, DFS technique is used for tracing the solution for the given problem

ii) Typically decision problem can be solved using backtracking

iii) While finding the solutions to the prblm, bad choices can be made

iv) The state space tree is searched until the soln is obtained

v) Appl's of backtracking are  
 - N-Queen prblm  
 - Graph colouring  
 - Hamiltonian cycle

### Branch and Bound

i) In BnB, BFS technique is used for tracing the soln for the given problem

ii) Typically optimiztn problem solving using BnB.

iii) It proceeds only on optimal or better solutions.

iv) The state space tree needs to be searched completely as there may be chances of being an optimal soln anywhere in state space tree.

v) Appl's of branch + bound  
 - 0/1 Knapsack prblm  
 - Travelling Salesperson prblm

## O/I Knapsack Problem (LCBB)

$$M=15$$

$$n=3$$

$$(w_1, w_2, w_3) = (8, 12, 6)$$

$$(P_1, P_2, P_3) = (32, 24, 6)$$

Solution

$$\textcircled{I} \quad \frac{P_1}{w_1} = \frac{32}{8}; \quad \frac{P_2}{w_2} = \frac{24}{12}; \quad \frac{P_3}{w_3} = \frac{6}{6}$$

$$= 4; \quad = 2; \quad = 1$$

$$\frac{P_1}{w_1} > \frac{P_2}{w_2} > \frac{P_3}{w_3} > 1$$

\textcircled{II} Convert the given profits to negative profits  
 $\therefore (P_1, P_2, P_3) = (-32, -24, -6)$

\textcircled{III} Set upper =  $\infty$

\textcircled{IV} For Node 1

Lower Node.

$$M=15$$

$\frac{7 \times 24}{12}$	-14
8	-32

$$\hat{C}(1) = -32 - 14$$

$$\boxed{\hat{C}(1) = -46}$$

Upper bound

$$M=15$$

6	-6
8	-32

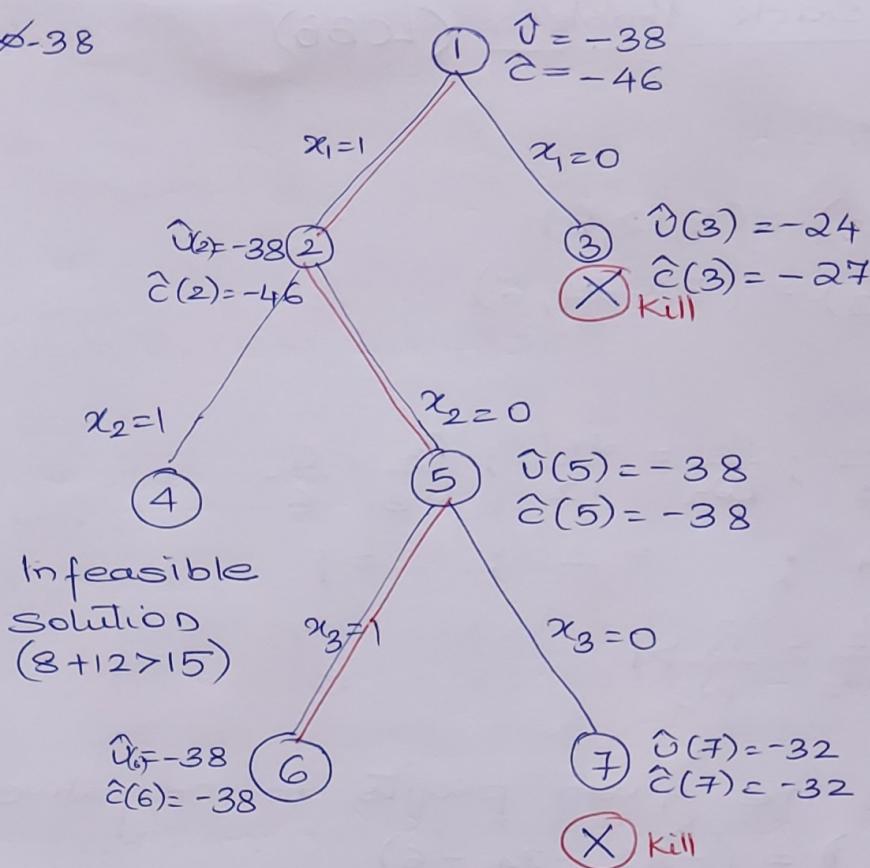
$$\hat{U}(1) = -32 - 6$$

$$\boxed{\hat{U}(1) = -38}$$

Check  $\hat{U}(1) < \text{upper} = -38 < \infty = -38$

$\hat{C}(1) > \text{upper} = -46 > -38$  (false), so explore node 1

Upper = -38



(V) For Node 2  $x_1 = 1$

Lower bound  $\hat{C}(2) =$  
$$\begin{array}{|c|c|}\hline 8 & 7/12x - 24 \\ \hline -32 & -14 \\ \hline \end{array} \Rightarrow \hat{C}(2) = -46$$

Upper bound  $\hat{U}(2) =$  
$$\begin{array}{|c|c|}\hline 8 & 6 \\ \hline -32 & -6 \\ \hline \end{array} \Rightarrow \hat{U}(2) = -38$$

Check  $\hat{U}(2) < \text{Upper} = -38 < -38$  (false)

$\hat{C}(2) > \text{Upper} = -46 > -38$  (false), Explore Node 2

(VI) For Node 3  $x_1 = 0$

Lower bound  $\hat{C}(3) =$  
$$\begin{array}{|c|c|}\hline 12 & 3/6x - 6 \\ \hline -24 & -3 \\ \hline \end{array} \Rightarrow \hat{C}(3) = -24 - 3 = -27$$

Upper bound  $\hat{U}(3) =$  
$$\begin{array}{|c|c|}\hline 12 \\ \hline -24 \\ \hline \end{array} \Rightarrow \hat{U}(3) = -24$$

Check  $\hat{U}(3) < \text{Upper} = -24 < -38$  (false)

$\hat{C}(3) > \text{Upper} = -27 > -38$  (true) Kill Node 3

⑦ For node 4,  $x_1=1, x_2=1$

Lower bound  $\hat{c}(4) \Rightarrow \begin{array}{|c|c|} \hline 8 & 12 \\ \hline -32 & -24 \\ \hline \end{array}$  (Infeasible solution)

VIII) For node 5,  $x_1=1, x_2=0$

Lower bound  $\hat{c}(5) \Rightarrow \begin{array}{|c|c|} \hline 8 & 6 \\ \hline -32 & -6 \\ \hline \end{array} \Rightarrow \hat{c}(5) = -38$

Upper bound  $\hat{U}(5) \Rightarrow \begin{array}{|c|c|} \hline 8 & 6 \\ \hline -32 & -6 \\ \hline \end{array} \Rightarrow \hat{U}(5) = -38$

Check  $\hat{U}(5) < \text{upper} = -38 < -38$  false

$\hat{c}(5) > \text{upper} = -38 > -38$  false, so expand node 5

⑧ For node 6,  $x_1=1, x_2=0, x_3=1$

Lower bound  $\hat{c}(6) \Rightarrow \begin{array}{|c|c|} \hline 8 & 6 \\ \hline -32 & -6 \\ \hline \end{array} \Rightarrow \hat{c}(6) = -38$

Upper bound  $\hat{U}(6) \Rightarrow \begin{array}{|c|c|} \hline 8 & 6 \\ \hline -32 & -6 \\ \hline \end{array} \Rightarrow \hat{U}(6) = -38$

Check  $\hat{U}(6) < \text{upper} = -38 < -38$  false

$\hat{c}(6) > \text{upper} = -38 > -38$  false, expand Node 6.

But no item is remaining to be considered.

⑨ Node 7,  $x_1=1, x_2=0, x_3=0$

Lower Bound  $\hat{c}(7) \Rightarrow \begin{array}{|c|} \hline 8 \\ \hline -32 \\ \hline \end{array} \Rightarrow \hat{c}(7) = -32$

Upper bound  $\hat{U}(7) \Rightarrow \begin{array}{|c|} \hline 8 \\ \hline -32 \\ \hline \end{array} \Rightarrow \hat{U}(7) = -32$

Check if  $\hat{U}(7) < \text{upper} = -32 < -38$  false

$\hat{c}(7) > \text{upper} = -32 > -38$  true, kill Node 7

⑩ Solution Vector is  $x(x_1, x_2, x_3) = (1, 0, 1)$  Max profit = -38  
Weight = 14

i) for Node 6,  $x_1=1, x_2=1, x_3=1$

Lower bound  $\hat{c}(6) = \begin{bmatrix} 2 & 4 & 6 \\ -10 & -18 & -12 \end{bmatrix}$

Here  $2+4+6 > 8$ , so it will lead to a infeasible solution

ii) For Node 7,  $x_1=1, x_2=1, x_3=0$

Lower bound  $\hat{c}(7) \Rightarrow \begin{array}{|c|c|} \hline 2 & 4 \\ \hline -10 & -18 \\ \hline \end{array} \Rightarrow \hat{c}(7) = -28$

Upper bound  $\hat{U}(7) \Rightarrow \begin{array}{|c|c|} \hline 2 & 4 \\ \hline -10 & -18 \\ \hline \end{array} \Rightarrow \hat{U}(7) = -28$

Check  $\hat{U}(7) < \text{upper} = -28 < -28$  (false)

$\hat{c}(7) > \text{upper} = -28 > -28$  (false) Expand Node 7.

But all items are considered so stop.

∴ The solution vector  $x(x_1, x_2, x_3) = (1, 1, 0)$

Max Profit =  $10x_1 + 18x_2 + 12x_3 = 28$

Max Weight =  $2x_1 + 4x_2 + 6x_3 = 6$ .

For Node 2,  $x_1=1$

Lower Bound  $\hat{c}(2) \Rightarrow$ 

2	4	$\frac{2}{6}x-12$
-10	-18	-4

 $\Rightarrow -32$

Upper bound  $\hat{U}(2) \Rightarrow$ 

2	4
-10	-18

 $\Rightarrow -28$

Check  $\hat{U}(2) < \text{upper} = -28 < -28$  (false)

$\hat{c}(2) > \text{upper} = -32 > -28$  (false) expand Node 2

6) For Node 3,  $x_1=0$

Lower Bound  $\hat{c}(3) \Rightarrow$ 

4	$\frac{4}{6}x-12$
-18	-8

 $\Rightarrow -26$

Upper Bound  $\hat{U}(3) \Rightarrow$ 

4
-18

 $\Rightarrow \hat{U}(3) = -18$

Check  $\hat{U}(3) < \text{upper} = -18 < -28$  (false)

$\hat{c}(3) > \text{upper} = -26 > -28$  (true), Kill Node 3.

7) Node 4,  $x_1=1, x_2=1$

Lower Bound  $\hat{c}(4) =$ 

2	4	$\frac{2}{6}x-12$
-10	-18	-4

 $\Rightarrow -32$

Upper bound  $\hat{U}(4) =$ 

2	4
-10	-18

 $\Rightarrow -28$

Check  $\hat{U}(4) < \text{upper} = -28 < -28$  false

$\hat{c}(4) > \text{upper} = -32 > -28$  (false), Expand Node 4

8) Node 5,  $x_1=1, x_2=0$

Lower bound  $\hat{c}(5) =$ 

2	6
-10	-12

 $\Rightarrow -22$

Upper bound  $\hat{U}(5) =$ 

2	6
-10	-12

 $\Rightarrow -22$

Check  $\hat{U}(5) < \text{upper} = -22 < -28$  (false)

$\hat{c}(5) > \text{upper} = -22 > -28$  (true) Kill Node 5

$$\textcircled{2} \quad M=8, n=3, (\omega_1 \omega_2 \omega_3) = (2, 4, 6) \quad (\text{LCBB})$$

$$(\text{P}_1 \text{ P}_2 \text{ P}_3) = (-10, -18, -12)$$

Sol<sup>2</sup>. 1) Arrange the items in P/W order

$$(\text{P}_1/\omega_1, \text{P}_2/\omega_2, \text{P}_3/\omega_3) = (10/2, 18/4, 12/6)$$

$$= (5, 4.5, 2)$$

2) Convert each profit value to negative profits

$$(\text{P}_1 \text{ P}_2 \text{ P}_3) = (-10, -18, -12)$$

3) Set  $\boxed{\text{Upper} = \infty}$

4) For Node 1

$$M=8$$

Lower bound  $\hat{C}(1) \Rightarrow$

2	4	$2/6 \times -12$
-10	-18	-4

 $\Rightarrow -32$

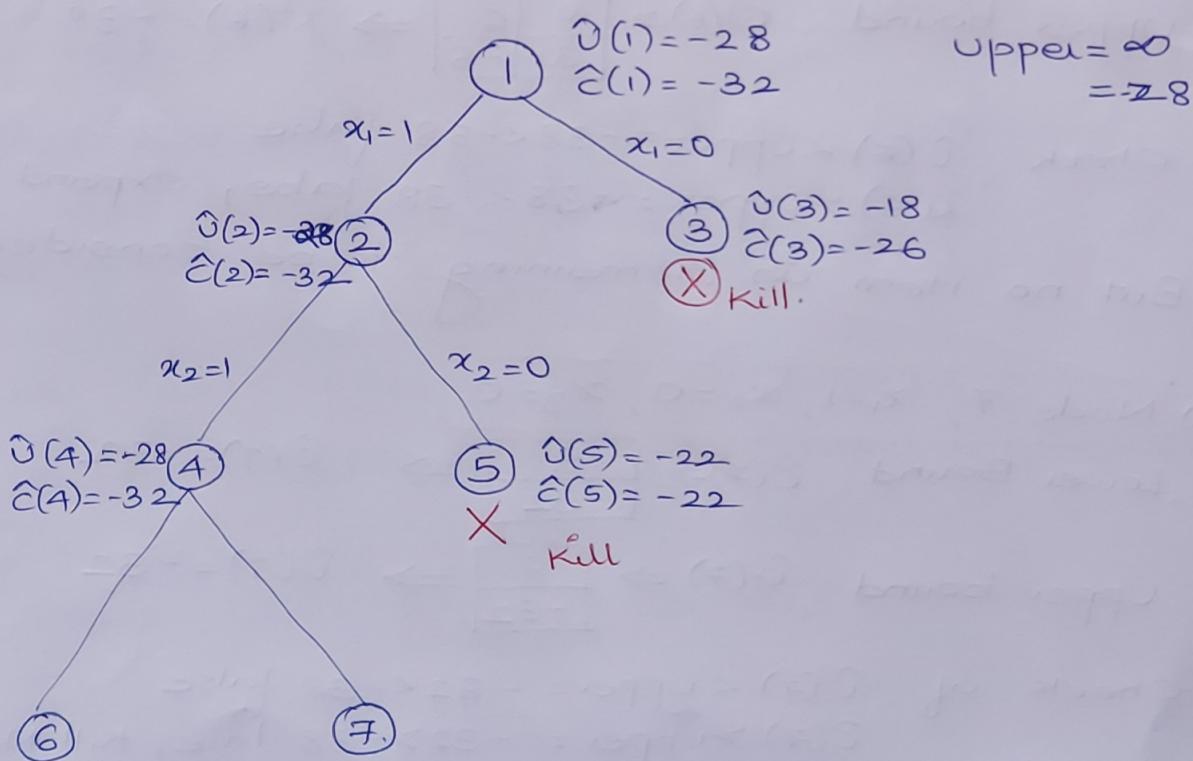
Upper bound  $\hat{U}(1) \Rightarrow$

2	4
-10	-18

 $\Rightarrow -28$

Check  $\hat{U}(1) < \text{Upper} = -28 < \infty, \text{Upper} = -28$

$\hat{C}(1) > \text{Upper} = -32 > -28$ , (False) Expand Node 1



## TRAVELLING SALESPERSON USING BRANCH AND BOUND

If there are 'n' cities and cost of travelling from one city to another city are given. A Salesman has to start from one city and has to visit all the cities exactly once and has to return to the starting place with shortest distance or minimum cost.

Let  $G = (V, E)$  be a directed graph defining an instance of the traveling salesperson problem.

A tour of  $G$  is a directed simple cycle that includes every vertex ' $v$ '. The cost of the tour is the sum of cost of the edges on the tour.

Let  $c_{ij}$  be the cost of edge  $(i, j)$  and  $c_{ij} = \infty$  if  $(i, j) \notin E(G)$  and  $|V| = n$

Assume that every tour starts and ends at vertex 1. So the solution space  $S$  is given by  $S = \{(1, \pi, 1) \mid \pi \text{ is a permutation of } \{2, 3, \dots, n\}\}$ .

Then  $|S| = (n-1)!$

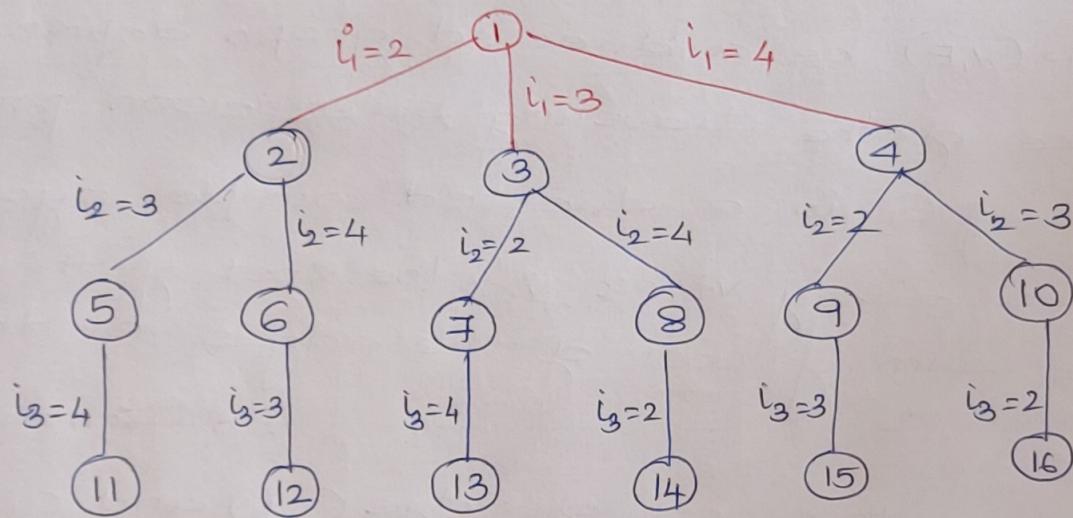
The size of  $S$  can be reduced by restricting  $S$  so that  $(1, i_1, i_2, \dots, i_{n-1}, 1) \in S$  iff  $(i_j, i_{j+1}) \in E$   $0 \leq j \leq n-1$  and  $i_0 = i_n = 1$ .

$S$  can be organized into a state space tree.

Consider a tree organization given below for the case of a complete graph with  $|V|=4$ .

Each leaf node  $L$  is a solution node + represents the tour defined by the path from the root to  $L$ .

Eg: Node 14 represents the tour  $i_0=1, i_1=3, i_2=4, i_3=2$  and  $i_4=1$ .



State space tree for travelling salesperson problem with  $n=4$  +  $i_0=i_4=1$

### Matrix Reduction

A row or column is said to be reduced if it contains atleast one zero and all the remaining entries are non-negative in that row/column.

A matrix is called reduced iff every row and columns are reduced.

This matrix reduction to compute cost for in TSP using BB.

(2)

### Example for matrix reduction

$\infty$	20	30	10	11
15	$\infty$	16	4	2
3	5	$\infty$	2	4
19	6	18	$\infty$	3
16	4	7	16	$\infty$

Row reduction  $\Rightarrow$ 

$\infty$	20	30	10	11	Min value
15	$\infty$	16	4	2	2
3	5	$\infty$	2	4	2
19	6	18	$\infty$	3	3
16	4	7	16	$\infty$	4

After row reduction  $\Rightarrow$ 

$(\infty-10)$	$(20-10)$	$(30-10)$	$(10-10)$	$(11-10)$	All rows are reduced as each row entry has atleast one zero
$\infty$	10	20	0	1	
13	$\infty$	14	2	0	
1	3	$\infty$	0	2	
16	3	15	$\infty$	0	
12	0	3	12	$\infty$	

Now, check the column for reduction

$\infty$	10	20	0	
13	$\infty$	14	2	0
1	3	$\infty$	0	2
16	3	15	$\infty$	0
12	0	3	12	$\infty$

These columns are reduced as atleast a single zero

$\infty$	10	17	0	1
12	$\infty$	11	2	0
0	3	$\infty$	0	2
15	3	12	$\infty$	0
11	0	0	12	$\infty$

Min Value 1 0 3 0 0

Reduced matrix

$$\text{So, the total reduced} = \frac{\text{total row reduction cost}}{\text{Reduction Cost}} + \frac{\text{total column reduction cost}}{\text{Reduction Cost}}$$

$$= (10+2+2+3+4) + (1+0+3+0+0)$$

$$= 21 + 4$$

$$= 25$$

In all tour, for all  $j$  there is an exactly leaving vertex one edge  $(j, k)$  for  $k=1, 2, \dots, n$  and there is an exactly one edge  $(k, j)$  for  $k=1, 2, \dots, n$

eg:  $1 \rightarrow 2 \rightarrow 3 \rightarrow 4 \rightarrow 1$

If  $j=3$ , one edge  $(j, k)$  where  $j$  is leaving vertex  $(3, 4)$  for all  $k$  one edge  $(k, j)$  where  $j$  is entering vertex  $(2, 3)$

If a constant is chosen to be minimum entry in row ' $i$ ' or column ' $j$ ', then subtracting it from all entries in row ' $i$ ' or column ' $j$ ' will introduce a zero into row ' $i$ ' or column ' $j$ '.

The total amount subtracted from the columns and rows is lower bound on the length of a minimum cost tour and can be used as lower bound  $\hat{C}(x)$  value for the root of the state space tree.

Original Matrix

$\infty$	20	30	10	11
15	$\infty$	16	4	2
3	5	$\infty$	2	4
19	6	18	$\infty$	3
16	4	7	16	$\infty$

Reduced Matrix

$\infty$	10	17	0	1
12	$\infty$	11	2	0
0	3	$\infty$	0	2
15	3	12	$\infty$	0
11	0	0	12	$\infty$

Consider the tour  $T_1 : 1-2-3-4-5-1$

$$\begin{aligned} T_1 &= C_{12} + C_{23} + C_{34} + C_{45} + C_{51} \\ &= 20 + 16 + 2 + 3 + 16 \\ &= 57 \end{aligned}$$

$$\begin{aligned} T_1 &= C_{12} + C_{23} + C_{34} + C_{45} + C_{51} \\ &= 10 + 11 + 0 + 0 + 1 \\ &= 32 \end{aligned}$$

$\therefore$  Total Reduction Cost = 25 from previous red process

We may note  $= 57 - 32 = 25$ .

Hence, All tours in the original graph have a length at least 25.

(3)

NOTE:

Since every tour on the graph includes exactly one edge  $(i,j)$  with  $i \neq j$  with  $i=k, 1 \leq k \leq n$  and exactly one edge  $(i,j)$  with  $j=k, 1 \leq k \leq n$ , subtracting a constant  $t$  from every entry in one column or one row of the cost matrix reduces the length of every tour by exactly  $t$ . A minimum cost tour remains a minimum cost tour following this subtract operation.

Matrix Original Cost	Tour Cost of Reduced Matrix		
of tour			
57	—	32	$\Rightarrow 25$

Conclusion - If we subtract a min amount from the row/col and we reduce to matrix then total amt subtracted will reduce the cost of the tour by that amount.

$$57 - 32 = 25$$

$$32 + 25 = 57$$

$\therefore$  Cost of every tour will be reduced by 23

Min. Cost of the tour will not be changed, so this will give the lower bound ie cost of the tour in this graph cannot be less than 25. So here this amount is used as cost function and associate the reduction matrix with every node of the state space tree

$\Rightarrow$  The reduced cost matrix is associated with every node in the travelling salesperson state space tree

$\Rightarrow$  Let  $A$  be the reduced cost matrix for node  $R$ . Let  $S$  be a child of  $R$  such that the tree edge  $(R,S)$  corresponds to including edge  $(i,j)$  in the tour.

$\Rightarrow$  If  $S$  is not a leaf, then the reduced cost matrix for  $S$  may be obtained as follows:

- (1) Change all entries in row  $i$  and column  $j$  of  $A$  to  $\infty$ .
- (2) Set  $A(j, 1)$  to  $\infty$
- (3) Apply row reduction + column reduction except for rows + columns containing  $\infty$
- (4) The total cost of node ' $S$ ' can be calculated as  $\hat{c}(S) = \hat{c}(R) + A(i, j) + g_1$  where ' $g_1$ ' is the total amount subtracted in Step 3.

For upper bound for  $u$ , use  $u(R) = \infty$  for all nodes  $R$

Solve the following instance of TSP using LCBB (4)

$$\begin{bmatrix} \infty & 16 & 11 & 6 \\ 8 & \infty & 13 & 16 \\ 4 & 7 & \infty & 9 \\ 5 & 12 & 2 & \infty \end{bmatrix}$$

### Sol 1) Row Reduction

Subtract row minimum value from cost. row

$$\begin{bmatrix} \infty & 16 & 11 & 6 \\ 8 & \infty & 13 & 16 \\ 4 & 7 & \infty & 9 \\ 5 & 12 & 2 & \infty \end{bmatrix} \xrightarrow{\text{Min}} \begin{bmatrix} \infty & 10 & 5 & 0 \\ 0 & \infty & 5 & 8 \\ 0 & 3 & \infty & 5 \\ 3 & 10 & 0 & \infty \end{bmatrix}$$

Row reduction Cost =  $6+8+4+2=20$

### Column Reduction

Subtract column minimum value from cost. col.

$$\begin{bmatrix} \infty & 10 & 5 & 0 \\ 0 & \infty & 5 & 8 \\ 0 & 3 & \infty & 5 \\ 3 & 10 & 0 & \infty \end{bmatrix} \xrightarrow{\text{Min}} \begin{bmatrix} \infty & 7 & 5 & 0 \\ 0 & \infty & 5 & 8 \\ 0 & 0 & \infty & 5 \\ 3 & 7 & 0 & \infty \end{bmatrix}$$

Column Reduction Cost = 3

Total Reduction Cost

= Row Reduction Cost + Column Reduction Cost

=  $20+3$

=  $(23)$

Reduction Matrix A is

$$\begin{bmatrix} \infty & 7 & 5 & 0 \\ 0 & \infty & 5 & 8 \\ 0 & 0 & \infty & 5 \\ 3 & 7 & 0 & \infty \end{bmatrix}$$

$$\boxed{\hat{c}(1) = 23}$$

Steps to find the cost corr. to every vertex

Suppose edge  $(i, j)$  is added

- 1) Make all entries in row  $i$  and column  $j$  as  $\infty$
- 2) Make entry  $(j, i)$  as  $\infty$
- 3) Reduce corr. matrix by subtracting amt  $R_i$

$$\hat{C}(s) = \hat{C}(R) + A[i, j] + R_i$$

For node 2, consider path  $(1, 2)$

Make all entries in row 1 and column 2 as  $\infty$

and  $A[2, 1]$  as  $\infty$

$$\begin{array}{c} 1 \\ 2 \\ 3 \\ 4 \end{array} \left[ \begin{array}{cccc} \infty & 7 & 5 & 0 \\ 0 & \infty & 5 & 8 \\ 0 & 0 & \infty & 5 \\ 3 & 7 & 0 & \infty \end{array} \right] \Rightarrow \left[ \begin{array}{cccc} \infty & \infty & \infty & \infty \\ \infty & \infty & 5 & 8 \\ 0 & \infty & \infty & 5 \\ 3 & \infty & 0 & \infty \end{array} \right]$$

Perform row reduction & col' reduction except for row & col containing  $\infty$

$$\left[ \begin{array}{cccc} \infty & \infty & \infty & \infty \\ \infty & \infty & 5 & 8 \\ 0 & \infty & \infty & 5 \\ 3 & \infty & 0 & \infty \end{array} \right] \xrightarrow{\text{Row Red'}} \left[ \begin{array}{cccc} \infty & \infty & \infty & \infty \\ \infty & \infty & 0 & 3 \\ 0 & \infty & \infty & 5 \\ 3 & \infty & 0 & \infty \end{array} \right] \xrightarrow{\text{Col' Red'}} \left[ \begin{array}{cccc} \infty & \infty & 0 & 0 \\ \infty & \infty & 0 & 0 \\ 0 & \infty & 0 & 2 \\ 3 & \infty & 0 & \infty \end{array} \right]$$

$$\begin{aligned} \text{Total Red' Cost} &= \text{Total Row Red' Cost} + \text{Total Col' Red' Cost} \\ &= 5 + 3 \\ &= 8 \end{aligned}$$

$$\begin{aligned} \therefore \hat{C}(2) &= \hat{C}(1) + A[1, 2] + R_1 \\ &= 23 + 7 + 8 \\ &= 38 \end{aligned}$$

For node 3, consider path (1,3)

Make all entries in row 1 and column 3 of A as  $\infty$   
and  $A[3,1]$  as  $\infty$

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & 8 \\ \infty & 0 & \infty & 5 \\ 3 & 7 & \infty & \infty \end{bmatrix}$$

of A

$$A = \begin{bmatrix} \infty & 7 & 5 & 0 \\ 0 & \infty & 5 & \infty \\ 0 & 0 & \infty & 5 \\ 3 & 7 & 0 & \infty \end{bmatrix}$$

Perform row redn + column redn except for row  
+ col. containing  $\infty$

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & 8 \\ \infty & 0 & \infty & 5 \\ 3 & 7 & \infty & \infty \end{bmatrix} \xrightarrow{\text{Min } 3} \begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & 8 \\ \infty & 0 & \infty & 5 \\ 0 & 4 & \infty & \infty \end{bmatrix} \xrightarrow{\text{Min } 0} \begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & 03 \\ \infty & 0 & \infty & 0 \\ 0 & 4 & \infty & \infty \end{bmatrix}$$

$\xrightarrow{\text{Row Reduction}}$        $\xrightarrow{\text{Col. Reduction}}$

$$\text{Total Redn Cost (g)} = 3 + 5 = 8$$

$$\therefore \hat{c}(3) = \hat{c}(\cdot) + A[1,3] + g \\ = 23 + 5 + 8$$

$$\boxed{\hat{c}(3) = 36}$$

For Node 4, consider path (1,4)

Make all entries in row 1 + column 4 of A as  $\infty$   
and  $A[4,1] = \infty$

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & 5 & \infty \\ 0 & \cancel{\infty} & \infty & \infty \\ \infty & 7 & 0 & \infty \end{bmatrix}$$

Perform row redn + column reduction  
except for row + col. containing  $\infty$

				Min
$\infty$	$\infty$	$\infty$	$\infty$	0
0	$\infty$	5	$\infty$	0
0	0	$\infty$	$\infty$	0
$\infty$	7	0	0	0
Min	0	0	0	

As rows & columns are reduced.  
Total red<sup>n</sup> cost(91) = 0

$$\therefore \hat{C}(4) = \hat{C}(1) + A(1,4) + 91 \\ = 23 + 0 + 0$$

$$\boxed{\hat{C}(4) = 23}$$

As LCBB is used among the three cost live nodes  
 $\min(\hat{C}(2), \hat{C}(3), \hat{C}(4))$  is used for exploring  
 $= \min(38, 36, 23)$   
 $= 23$ .

$\therefore$  Select node 4.

1+4 are selected so remaining nodes  
are 2+3. So now find cost of 5+6 in  
the state space tree

Now, after performing 1 to 4, now the reduction  
matrix is obtain from node 4 ie

Reduction Matrix A = 
$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & 5 & \infty \\ 0 & 0 & \infty & \infty \\ \infty & 7 & 0 & \infty \end{bmatrix}$$

Consider path(4,2), for node 5

Make all entries row 1, 4th and col 2 of A as  $\infty$

as  $A[2, 1] = \infty$ .

$A[4, 1] = \infty$

$\infty$	$\infty$	$\infty$	$\infty$
$\infty$	$\infty$	5	$\infty$
0	$\infty$	$\infty$	$\infty$
$\infty$	$\infty$	$\infty$	$\infty$

Perform row red<sup>n</sup> + col red<sup>n</sup> except for row + col containing  $\infty$

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ \infty & \infty & 5 & \infty \\ 0 & \infty & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix} \xrightarrow{\text{Min}} \begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & 0 & \infty \\ 0 & \infty & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix}$$

Min 0 5

$$\text{Total Red}^n \text{ Cost (g)} = 05 + 0 = 5$$

$$\hat{c}(5) = \hat{c}(4) + A[4, 2] + g$$

$$= 23 + 7 + 5 = 35$$

$$\boxed{\hat{c}(5) = 35}$$

Node 6, consider path([4, 3])

Make all entries <sup>row 1, row 4 + col 3</sup> of  $A = \infty + A[4, 1]$   
 $+ A[3, 1] = \infty$

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & \infty \\ \infty & 0 & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix}$$

$$A = \begin{bmatrix} \infty & \infty & \infty & 0 \\ 0 & \infty & 5 & \infty \\ 0 & 0 & \infty & \infty \\ \infty & 7 & 0 & \infty \end{bmatrix}$$

Perform row + Col. Reduction

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & \infty \\ 0 & 0 & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix} \xrightarrow{\text{Min}} \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}$$

Min 0 0

As row + cols are reduced  
 total red<sup>n</sup> cost (g) = 0

$$\therefore \hat{c}(6) = \hat{c}(4) + A(4, 3) + g$$

$$= 23 + 0 + 0$$

$$\boxed{\hat{c}(6) = 23}$$

Among node to be explored further is the node with min cost value. ∴ from State space tree we can see Node 6 is min + can be explored.

For Node 7, path is ~~(2, 2)~~ (1, 4, 3, 2)

Make all entries of row(3) + col 2 of A as  $\infty$   
 $\Rightarrow A[2, 1] = \infty, A[4, 1] = \infty, A[3, 1] = \infty$

$$A = \begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & \infty \\ 0 & 0 & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix} \Rightarrow \begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & \infty \\ 0 & 0 & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix}$$

Perform Row & Col Redn.

$$\begin{bmatrix} \infty & \infty & \infty & \infty \\ 0 & \infty & \infty & \infty \\ \infty & \infty & \infty & \infty \\ \infty & \infty & \infty & \infty \end{bmatrix} \text{ Min}$$

Now row & col. are reduced

$$R_1 = 0$$

Min

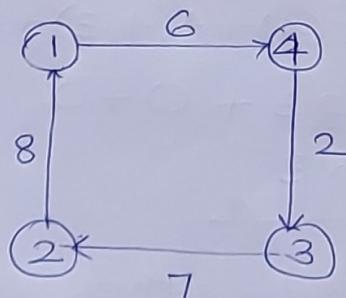
$$\therefore \hat{C}(7) = \hat{C}(6) + A[3, 2] + 9 \\ = 23 + 0 + 0$$

$$\boxed{\hat{C}(7) = 23}$$

The path is the solution tour is obtained ie 1-4-3-2-1 with cost = 23.

is reached, upper is updated to 23.

Check other five nodes ie 2, 3, 5. ~~they~~  
 Node 5 + have cost greater than 23. So this is only path.



$$\text{Cost} = 8 + 6 + 2 + 7 \\ = 23.$$

