

# **Branch and Bound algorithms**

Dr. Priyadarshan Dhabe,  
Ph.D (IIT Bombay)

## Branch and bound –general strategy

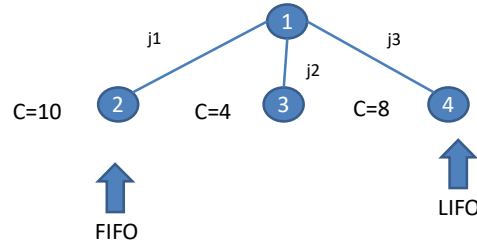
- Used for solving the **optimization problems**
- Mostly for **minimization problem** (but if we negate the function under consideration then maximization problems can also be solved)

Find  $x$  such that

$$\min f(x)$$

- It works in a **Breadth First manner** (as opposed to backtracking)
- For each **branch** it uses **bound** (number) and a given branch is chosen based on the bound, for **further exploration** if multiple choices are there.

## State space search tree generation in branch and bound- Least cost approach



**Each node has cost C and next node will be selected based on the minimum cost**

<https://www.youtube.com/watch?v=tKvAniEbeqM>

## 0/1 knapsack problem using branch and bound- Least cost approach

N=4  
M=15

P	10	10	12	18
w	2	4	6	9

Find objects to be kept in the sack to maximize the profit. But branch and bound solves minimization problem. Thus, negate all the profits

N=4  
M=15

P	-10	-10	-12	-18
w	2	4	6	9

It works by computing lower bound  $c$  and upper bound  $u$  on each node and takes the decision.

$c$ -lower bound- fractions are allowed(for calculations only)

$u$ - upper bound- fractions are not allowed

-decides a branch to pursue based on bounds

<https://www.youtube.com/watch?v=tKvAniEbeqM>

# 0/1 knapsack problem using branch and bound- Least cost approach

N=4

M=15

For node 1

P	-10	-10	-12	-18
w	2	4	6	9

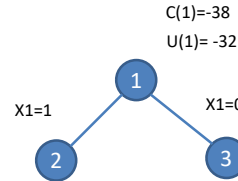
-6	3/9
-12	6
-10	4
-10	2

c=-38

-12	6
-10	4
-10	2

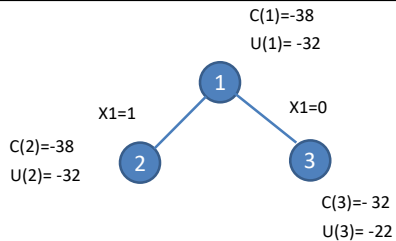
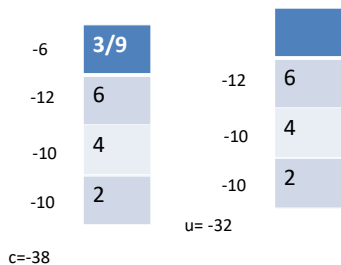
u= -32

$$3/9 * (-18) = -6$$

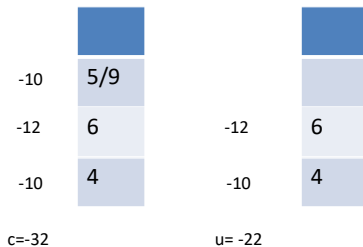


P	-10	-10	-12	-18
w	2	4	6	9

**For node2 -  $x_1=1$**

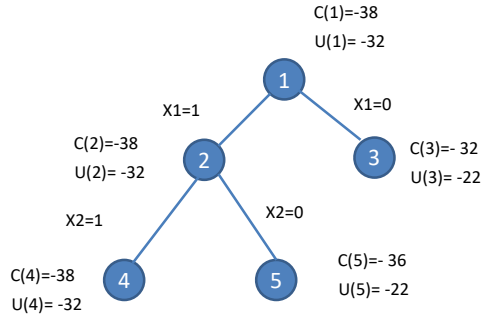
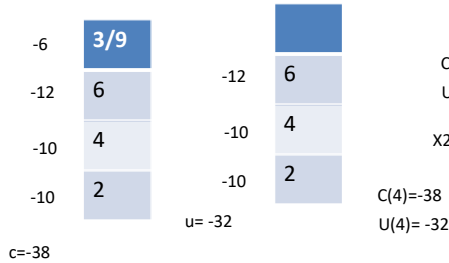


**For node 3 -  $x_1=0$**

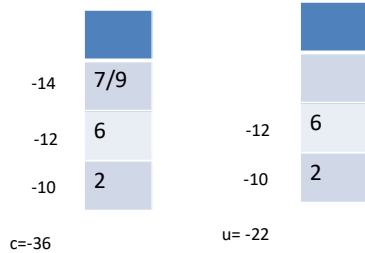


**Choose the next node for exploration as a node with minimum lower bound  $c$ , thus we will pick node 2.**

For node4 -  $x_1=1, x_2=1$



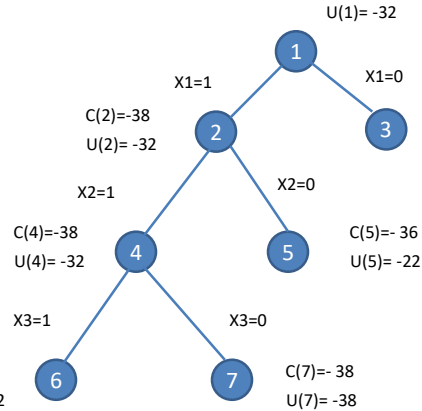
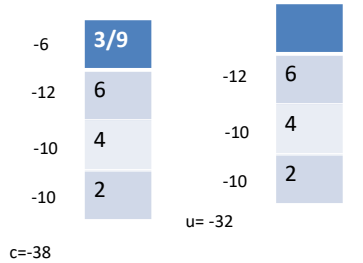
For node 5 -  $x_1=1, x_2=0$



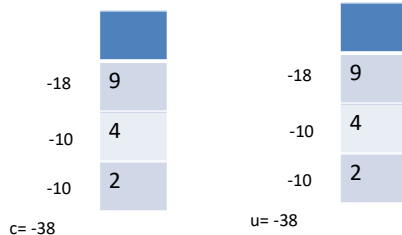
Expand the node 4 since it has minimum c value

P	-10	-10	-12	-18
w	2	4	6	9

For node 6-  $x_1=1, x_2=1, x_3=1$



For node 7-  $x_1=1, x_2=1, x_3=0$



Since node 6 and 7 has same  $c$ , chose node with minimum  $u$  i.e node 7

P	-10	-10	-12	-18
w	2	4	6	9



Node 8 –  $x=1, x_2=1, x_3=0, x_4=1$

$$C(8) = -38$$

$$U(8) = -38$$

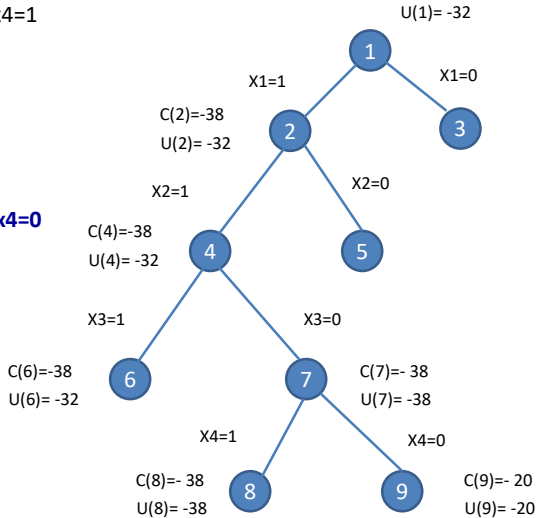
Node 9 –  $x=1, x_2=1, x_3=0, x_4=0$

$$C(9) = -20$$

$$U(9) = -20$$

Since node 8 is having minimum  $c$ , choose 8

Knapsack instance  
 $(x_1, x_2, x_3, x_4) = (1, 1, 0, 1)$



Maximum profit obtained is =  $-(-38) = +38$

## Solve following 0/1 knapsack problem using branch and bound- Least cost approach

N=4-objects

M=15- Knapsack capacity

P	10	10	12	9
w	2	4	6	9

- Solve the same problem using **FIFO branch and bound** and **LIFO branch and bound**
  - (hint updating global upper bound, if a node has lower bound greater than the global upper bound kill that node)

<https://www.youtube.com/watch?v=WXWt5xNrOf4>