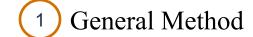
# Design and Analysis of Algorithm

Lecture-23: Branch and Bound

#### **Contents**



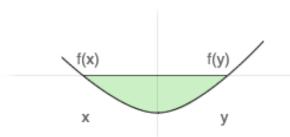


#### **Optimization Problem Types**

#### Convex and Non Convex optimization

A convex optimization problem is a problem where all of the constraints are convex functions, and the objective is a convex function if minimizing

If we can draw a line segment between any two points on the graph of a function such that there is no point of this graph that is above this line segment between these two points then the function is called a convex function.



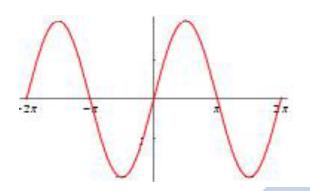
#### **Optimization Problem Types**

Convex and Non Convex optimization

A non-convex optimization problem is any problem where the objective or any of the constraints are non-convex

A non-convex function "curves up and down" -

- it is neither convex nor concave.



#### **Branch and Bound**

Branch and Bound is a state space search method in which all the children of a node are generated before expanding any of its children.

Branch-and-Bound is used to solve optimisation problems. When it realises that it already has a better optimal solution that the pre-solution leads to, it abandons that pre-solution. It completely searches the state space tree to get optimal solution



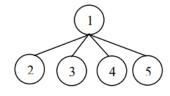
#### **Important Definition**

<u>Live node</u> is a node that has been generated but whose children have not yet been generated.

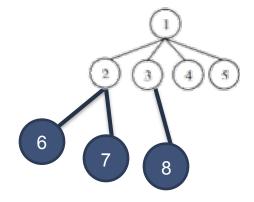
**E-node** is a live node whose children are currently being explored. In other words, an E-node is a node currently being expanded.

<u>Dead node</u> is a generated node that is not to be expanded or explored any further. All children of a dead node have already been expanded

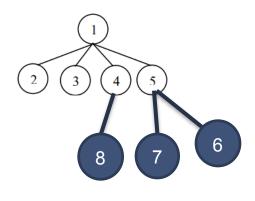
## Example



Live Node: 2, 3, 4, and 5



FIFO Branch & Bound (BFS) Children of E-node are inserted in a queue.



LIFO Branch & Bound (D-Search) Children of E-node are inserted in a stack.

#### Concept

Set up a bounding function, which is used to compute a bound (for the value of the objective function) at a node on a statespace tree and determine if it is promising

Nonpromising: if the bound is no better than the value of the best solution so far then do not expand beyond the node (pruning the state-space tree).

Promising: if the bound is better than the value of the best solution so far: expand beyond the node.

# 0-1 Knapsack

Capacity W=10

Item	Weight	Value	Value / weight
1	4	\$40	10
2	7	\$42	6
3	5	\$25	5
4	3	\$12	4

### 0-1 Knapsack

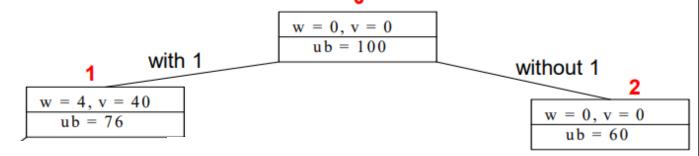
Compute Upper Bound

The maximum upper bound is - pick no items, take maximum profit item - ub = (10-0)\*(\$10) = \$100

-- all of item 1 (4, \$40) + partial of item 2 (7, \$42) After we pick item 1, -\$40 + (10-4)\*6 = \$76

If we don't pick item 1: -ub = (10-0) \* (\$6) = \$60

0-1 Kn



#### **Assignment problem**

Consider the problem of assigning  $\mathbf{n}$  people to  $\mathbf{n}$  jobs so that the total cost of the assignment is as small as possible.

$$C = P_{1} \begin{bmatrix} 9 & 2 & 7 & 8 \\ 6 & 4 & 3 & 7 \\ P_{3} & P_{4} & 7 & 6 & 9 & 4 \end{bmatrix}$$

It can be observed that the cost of any solution, including an optimal one, cannot be smaller than the sum of the smallest elements in each of the matrix's rows.

#### **Assignment problem**

