



# Branch and Bound

Week 14

# Required Activities

- Check Announcements regularly (every 2-3 days)
- Read FA book: Chapter 6
- Start working on Assignment 5

# Branch-and-Bound Design Strategy

- Branch-and-bound design strategy is similar to backtracking
- State space tree used to solve problem
- Difference between branch-and-bound and backtracking:
  1. branch-and-bound is not limited to a particular tree traversal
  2. branch-and-bound is used only for optimization problems
- Bound (number) is computed at a node to determine whether the node is promising
- Calculate Bound for a node
  - Bound best possible solution obtainable by expanding this node (minimum or maximum value)
  - Choose technique for calculating bound that produces best solution
  - If bound is no better than the value of the best solution found so far, node is non-promising (do not expand the node)
  - Otherwise, the node is promising
- Like backtracking, algorithms have typically exponential time complexity but can be efficient for large instances

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# Breadth-First Tree Search

- Use Queue - FIFO
- Visit root first
- Visit all nodes at level 1 next
- Visit all nodes at level 2 next . . .
- Visit all nodes at level n

- Algorithm:

```
void breadth_first_tree_search(Tree t)
{
    Queue Q;
    Node u, v;
    initialize(Q); //initialize queue to be empty
    r = root of T;
    visit v;
    enqueue(Q, v);
    while (!empty(Q))
    {
        dequeue(Q, v);
        for (each child u of v)
        {
            visit u;
            enqueue(Q, u)
        }
    }
}
```

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# Breadth-First with Bound

```
Node breadth_first_branch_and_bound(Tree t)
{
    Queue Q;
    Node u, v;
    int best;
    Q.initialize(); //initialize queue to be empty
    v = root of T;
    Q.enqueue(v);
    best = v.getValue()
    while (! Q.empty())
    {
        v = Q.dequeue();
        for (each child u of v)
        {
            if (u.getValue() > best)
                best = u.getValue()
            If (bound(u) > best)
                Q.enqueue(u)
        }
    }
}
```

# 0-1 Knapsack Problem

- Weight and profit at node are total weight and total profit of the items that have been included up to a node (same as in backtracking)
- Determine if a node is promising
  - If node's weight is  $\geq W$  OR **bound is  $\leq$  maxprofit** (the value of the **best solution** found up to that point) then non-promising
  - Otherwise
    - Initialize *totweight* to item's weight and *bound* to item's profit
    - Loop to add items weight to *totweight* and items profit to *bound* until item's weight brings *totweight* above  $W$
    - Grab the fraction of the item allowed by available weight and add profit of the fraction to bound
  - *Bound is calculated same as in backtracking*
- Traverse next to node with **bound greater** than current *maxprofit*

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# Best-First with Bound

```
Node breadth_first_branch_and_bound(Tree t)
{
    PriorityQueue PQ;
    Node u, v;
    int best;
    PQ.initialize(); //initialize priority queue to be empty
    v = root of T;
    PQ.insert(v);
    best = v.getValue()
    while (! PQ.empty())
    {
        v = PQ.remove(); // removes the highest valued item
        If (bound(v) > best) {
            for (each child u of v)
            {
                if (u.getValue() > best)
                    best = u.getValue()
                If (bound(u) > best)
                    PQ.insert(u)
            }
        }
    }
}
```

# Best-First Search with Branch-and-Bound pruning

- Can obtain solution quicker than breath-first-search or depth-first-search
- May not obtain optimum solution
- Uses bound to improve search
  - After visiting all of the children of a given node, expand the one with the **best** bound
  - Determine promising unexpanded node with greatest bound
  - Order determined by best bound rather than pre-determined
  - Uses priority queue to hold the nodes of state space



# Fig 6.2 (A6.1 breath) and Fig 6.3 (A6.2 best)

## Backtracking Algorithm 5.7:

Visit: (0, 0), (1, 1), (2, 1), (3, 1) **backtrack: (2, 1)**

Visit: (3, 2), (4, 1) **backtrack: (3, 2)**

Visit: (4, 2) **backtrack: (1, 1)**

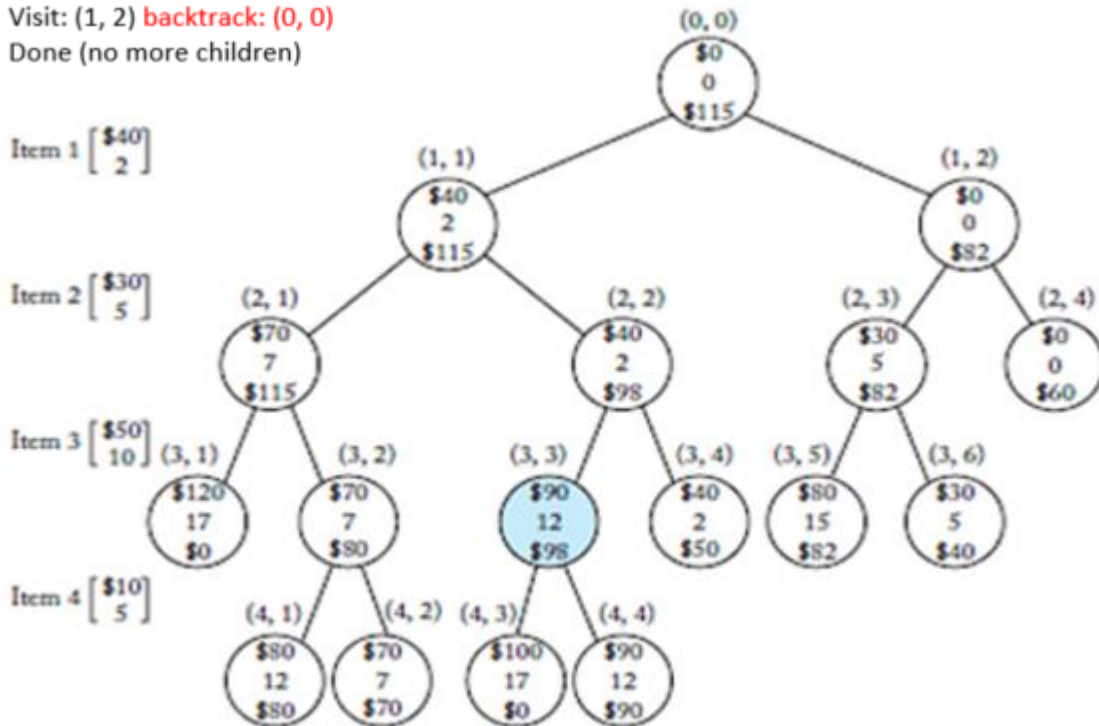
Visit: (2, 2), (3, 3), (4, 3) **backtrack: (3, 3)**

Visit: (4, 4) **backtrack: (2, 2)**

Visit: (3, 4) **backtrack: (0, 0)**

Visit: (1, 2) **backtrack: (0, 0)**

Done (no more children)



## Bound Algorithm 6.2:

Visit: (0, 0), (1, 1), (1, 2) then determine best bond (1, 1) so go to children

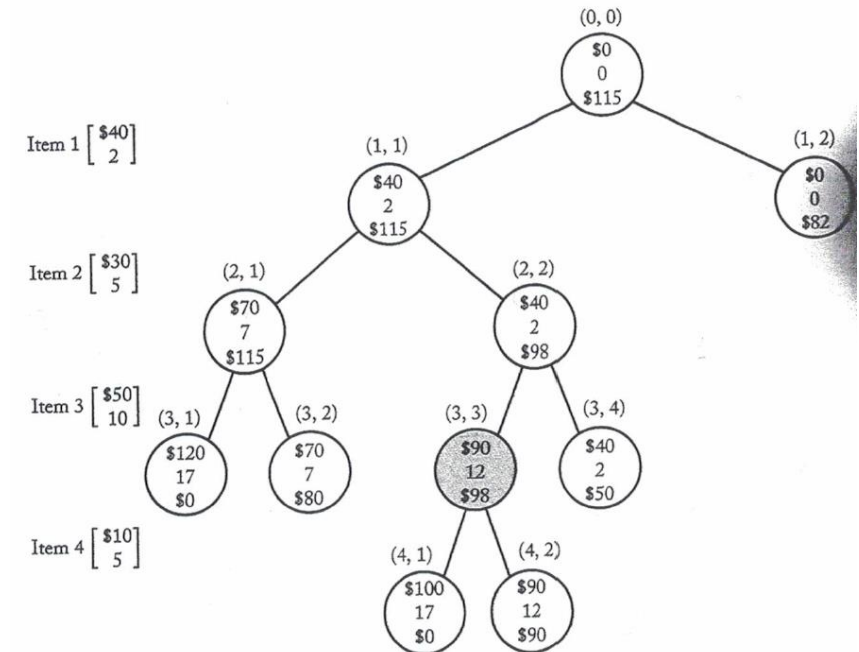
Visit: (2, 1), (2, 2) then best bond (2, 1)

Visit: (3, 1), (3, 2) then best bound (2, 2)

Visit: (3, 3), (3, 4) then best bound (3, 3)

Visit: (4, 1), (4, 2)

Done (no more promising unexpanded nodes)



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# Questions ?

- Post in the discussions
- Send email to [RMcFadden@HarrisburgU.edu](mailto:RMcFadden@HarrisburgU.edu)
- Respond usually within 48hours