



# Design and Analysis of Algorithms

## Lecture – 22

### Dynamic Programming – Optimal Binary Search Tree

**Success is always inevitable with Hard Work and Perseverance**

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# Learning Objective

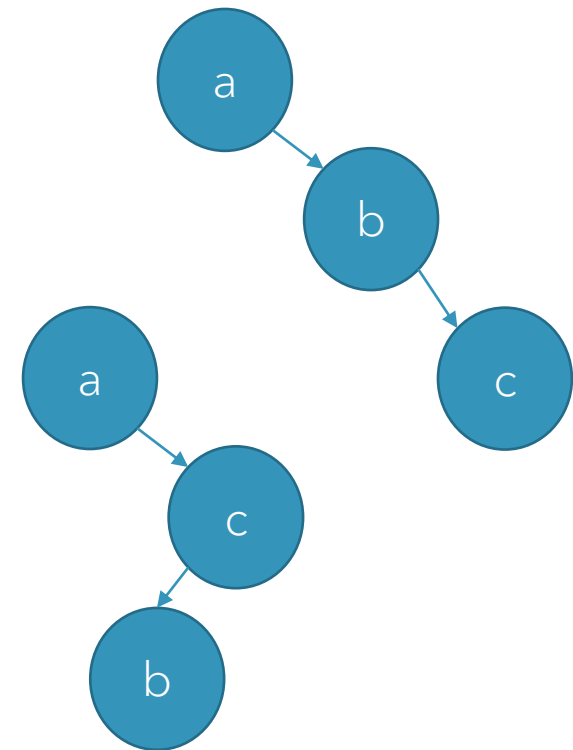
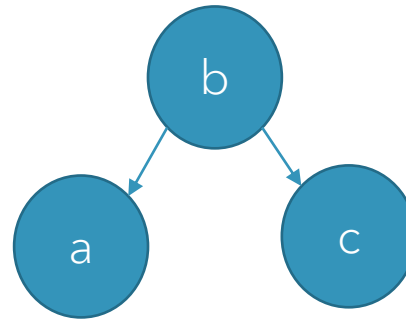
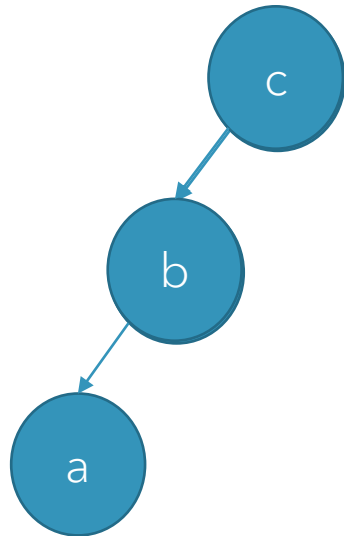
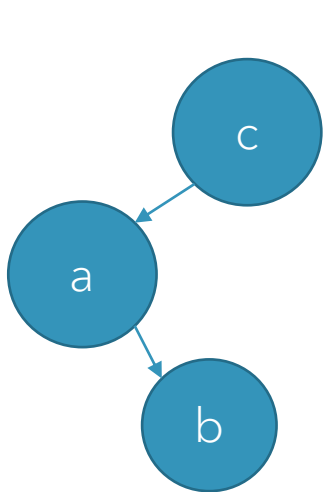
- Derive optimal solution for organizing set of keys in a binary search tree such that the cost of the search is reduced.
- (Only solutions using Tabulation are discussed)

# Optimal Binary Search Tree

- Given a set of keys  $\{c, a, b\}$  along with their probability of occurrence  $\{0.4, 0.4, 0.2\}$  arrange the keys in BST such that average cost of search for the keys is reduced.
- BST a special tree where a node can have at most two children and keys are ordered

# Optimal Binary Search Tree

- What are the different arrangements possible with keys c, a and b

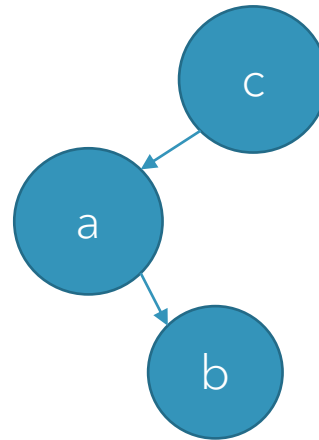


# Cost of the tree

- Let  $n_i$  denote number of search for key  $i$  in the tree and  $P_i$  denote the probability of occurrence of key  $i$

$$\text{cost of the tree} = \sum_{i=1}^k n_i P_i$$

Here,  $k$  denote the number of keys



Keys	a	b	c
$p_i$	0.4	0.2	0.4
$n_i$	2	3	1

$$\begin{aligned}\text{Cost} &= 0.4 * 2 + 0.2 * 3 + 0.4 * 1 \\ &= 0.8 + 0.6 + 0.4 = 1.8\end{aligned}$$

# Problem Instance

- Problem instance is defined by a set of keys
- Subproblem corresponds to smaller set of keys
- Smallest subproblem is constructing a tree with a single key

Cost of the tree = Probability of the key

# Optimal Substructure Property

- If the cost of the tree to be reduced then cost of the left subtree and right subtree should be optimal as well
- Knowing the cost of left and right subtree , adding a new key as a root node will increase the cost of keys in the subtrees by one.

$$\text{cost}[i, j] = \min_{i \leq k \leq j} ( \text{cost}[i, k-1] + \text{cost}[k+1, j] + \sum_{l=i}^j p_l )$$

if key k is root node, Left subtree – keys from i to k-1 and Right subtree – keys from k+1 to j

# Pause & Think

- What does cost  $[i,j]$  with  $i > j$  indicate?

Indicates the empty tree

- Why probability value of all keys is added to cost?

All the keys in left subtree and right subtree will have their search cost increased by one



# Problem

- Order the keys based on their value and number them from 1 to k

Keys	a	b	c
$p_i$	0.4	0.2	0.4

Create a main table and root table with rows equal to 1 to k and columns from 0 to k

# Problem

Keys	a	b	c
$p_i$	0.4	0.2	0.4

Main Table

i/j	0	1	2	3
1	0			
2	0	0		
3	0	0	0	

Root Table

i/j	0	1	2	3
1	-			
2	-	-		
3	-	-	-	

Shaded portions correspond to empty tree whose cost would be zero  
Only for the remaining cells cost needs to be computed

# Problem

Keys	a	b	c
$p_i$	0.4	0.2	0.4

## First find cost of trees with single key

Cost = probability of key  
Root should be key value

Main Table

i/j	0	1	2	3
1	0	0.4		
2	0	0	0.2	
3	0	0	0	0.4

Root Table

i/j	0	1	2	3
1	-	1		
2	-	-	2	
3	-	-	-	3

# Problem

Keys	a	b	c
$p_i$	0.4	0.2	0.4

Find cost of trees with two keys

Use the  $\text{cost}[i, j] = \min_{i \leq k \leq j} (\text{cost}[i, k-1] + \text{cost}[k+1, j] + \sum_{l=i}^j p_l)$

Main Table

i/j	0	1	2	3
1	0	0.4	?	
2	0	0	0.2	
3	0	0	0	0.4

Root Table

i/j	0	1	2	3
1	-	1		
2	-	-	2	
3	-	-	-	3

# Problem

Cost [1, 2] === (root = 1)

$$\text{Cost}[1,0] + \text{Cost}[2,2] + (0.4 + 0.2)$$

$$0 + 0.2 + 0.6 = 0.8$$

(root = 2)

$$\text{Cost}[1,1] + \text{Cost}[3,2] + (0.4+0.2)$$

$$0.4 + 0 + 0.6 = 1$$

Cost [1,2 ] = 0.8 (root as 1)

# Problem

Keys	a	b	c
$p_i$	0.4	0.2	0.4

Find cost of trees with two keys

Use the  $\text{cost}[i, j] = \min_{i \leq k \leq j} (\text{cost}[i, k-1] + \text{cost}[k+1, j] + \sum_{l=i}^j p_l)$

Main Table

i/j	0	1	2	3
1	0	0.4	0.8	
2	0	0	0.2	?
3	0	0	0	0.4

Root Table

i/j	0	1	2	3
1	-	1	1	
2	-	-	2	
3	-	-	-	3

# Problem

Cost [2, 3] === (root = 2)

$$\text{Cost}[2,1] + \text{Cost}[3,3] + (0.2 + 0.4)$$

$$0 + 0.4 + 0.6 = 1.0$$

(root = 3)

$$\text{Cost}[2,2] + \text{Cost}[4,3] + (0.2+0.4)$$

$$0.2 + 0 + 0.6 = 0.8$$

Cost [2,3 ] = 0.8 (root as 3)

# Problem

Keys	a	b	c
$p_i$	0.4	0.2	0.4

Find cost of trees with three keys

Use the  $\text{cost}[i, j] = \min_{i \leq k \leq j} (\text{cost}[i, k-1] + \text{cost}[k+1, j] + \sum_{l=i}^j p_l)$

Main Table

i/j	0	1	2	3
1	0	0.4	0.8	?
2	0	0	0.2	0.8
3	0	0	0	0.4

Root Table

i/j	0	1	2	3
1	-	1	1	
2	-	-	2	3
3	-	-	-	3



# Problem

Cost [1, 3] === (root = 1)

$$\begin{aligned} &\text{Cost}[1,0] + \text{Cost}[2,3] + (0.4 + 0.2 + 0.4) \\ &0 + 0.8 + 1.0 = 1.8 \end{aligned}$$

(root = 2)

$$\begin{aligned} &\text{Cost}[1,1] + \text{Cost}[3,3] + (0.4 + 0.2 + 0.4) \\ &0.4 + 0.4 + 1.0 = 1.8 \end{aligned}$$

(root = 3)

$$\begin{aligned} &\text{Cost}[1,2] + \text{Cost}[4,3] + (0.4 + 0.2 + 0.4) \\ &0.8 + 0 + 1.0 = 1.8 \end{aligned}$$

Cost [1,3 ] = 1.8 (root as 1 (or) 2 (or) 3)

# Problem

Keys	a	b	c
$p_i$	0.4	0.2	0.4

Find cost of trees with three keys

Use the  $\text{cost}[i, j] = \min_{i \leq k \leq j} (\text{cost}[i, k-1] + \text{cost}[k+1, j] + \sum_{l=i}^j p_l)$

Main Table

i/j	0	1	2	3
1	0	0.4	0.8	1.8
2	0	0	0.2	0.8
3	0	0	0	0.4

Root Table

i/j	0	1	2	3
1	-	1	1	1,2,3
2	-	-	2	3
3	-	-	-	3

# Optimal Tree Construction

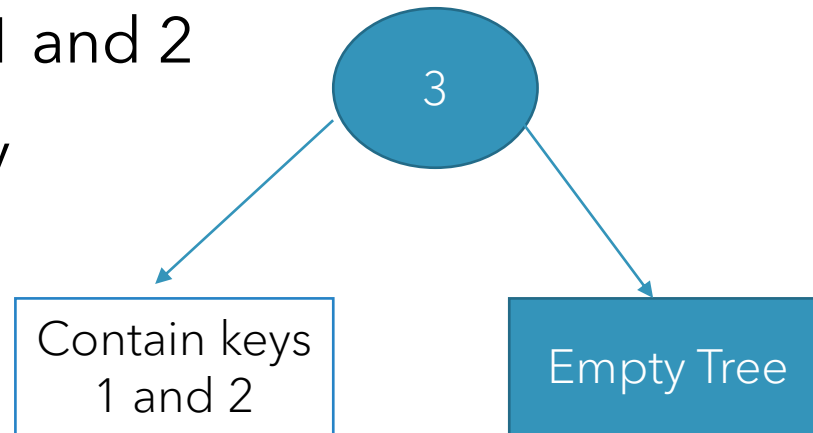
- Lookup on the root table for keys from 1 to 3

Here there are three possibilities

If we select 3 as root node

Left subtree contains 1 and 2

Right subtree is empty



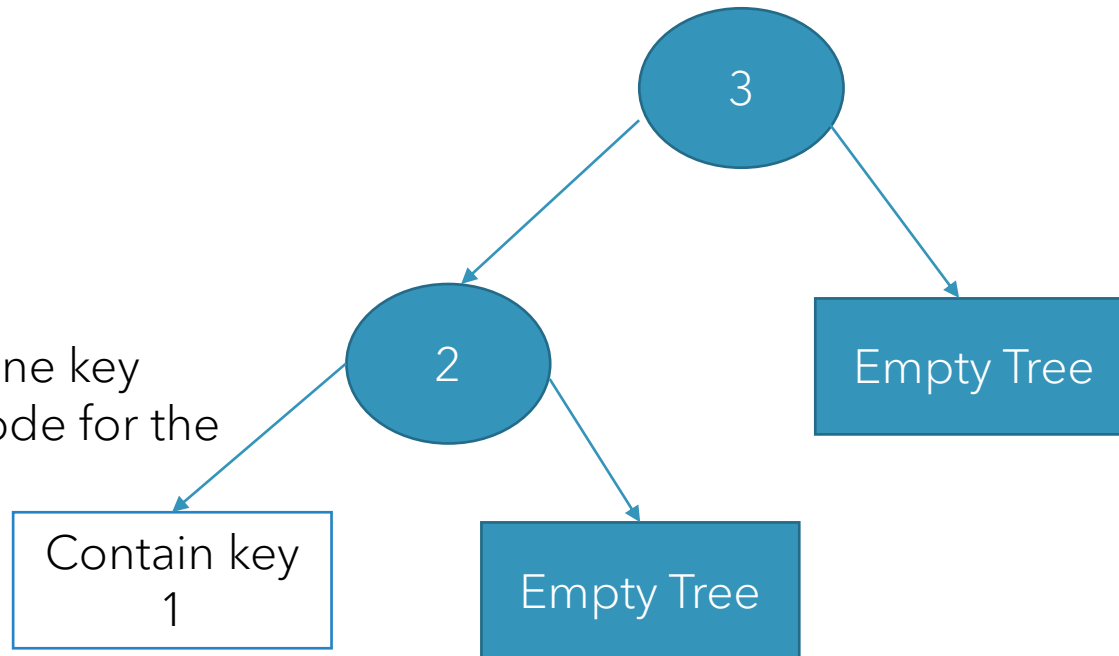
i/j	0	1	2	3
1	-	1	1	1,2,3
2	-	-	2	3
3	-	-	-	3

# Optimal Tree Construction

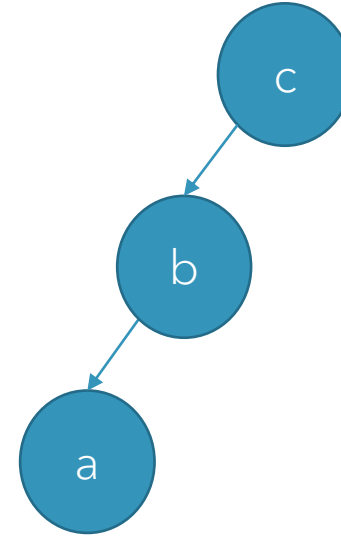
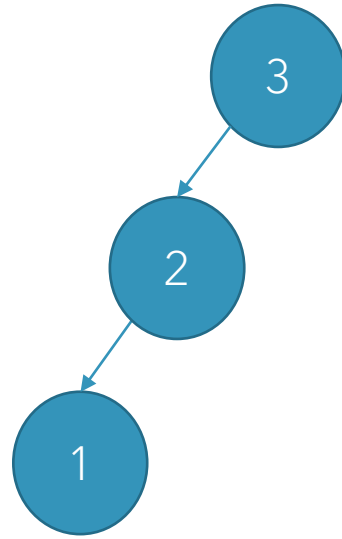
- Lookup on Cell [1,2] , the value is 2
- So 2 will be the root node in that subtree

i/j	0	1	2	3
1	-	1	1	1,2,3
2	-	-	2	3
3	-	-	-	3

If there is only one key  
then create a node for the  
key



# Optimal Tree



# Summary

- Discussed about dynamic programming solution for OBST (Optimal Binary Search Tree).

**Thank You**  
**Happy Learning**

**Success is always inevitable with Hard Work and Perseverance**