Binary Search Trees

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COMPCSI220: WEEK 9

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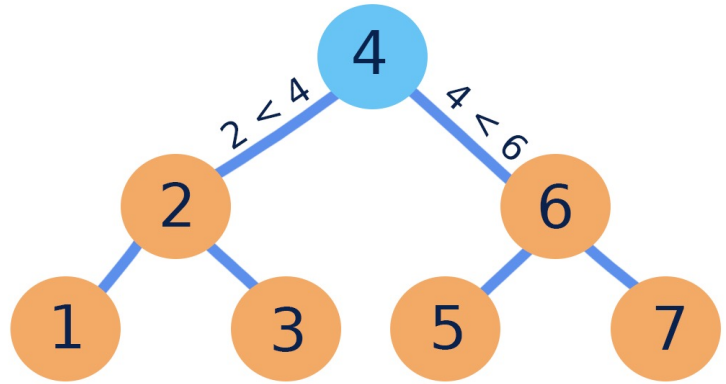
OUTLINE

- Tree Data Structure
- Binary Search Tree Operations
- Time Complexity Analysis
- BST Implementation

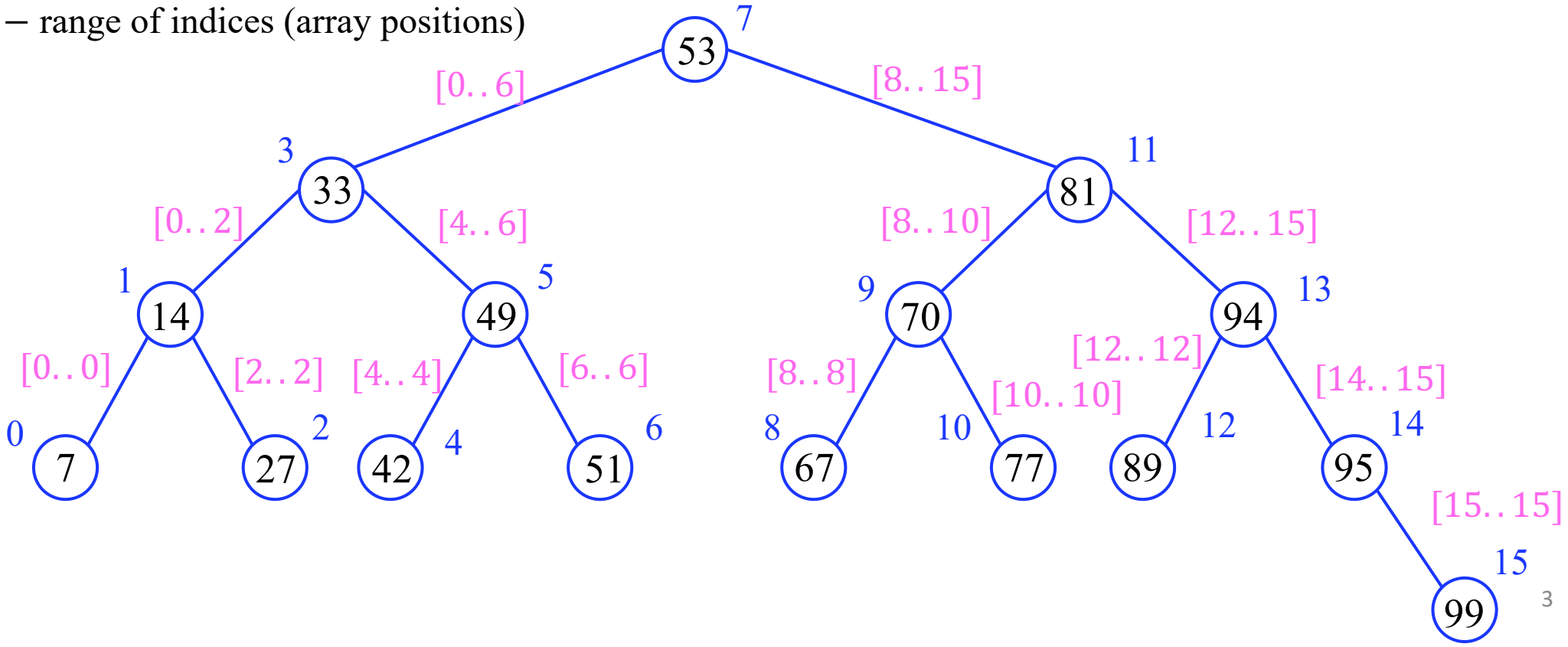


In Order Traversal: 1 2 3 4 5 6 7

Tree Structure of Binary Search

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
7	14	27	33	42	49	51	53	67	70	77	81	89	94	95	99

$[l..r]$ – range of indices (array positions)



Binary Search Tree

- The execution of Binary search (looking for all possible keys) can be described by a decision tree which is called a (static) **binary search tree**.

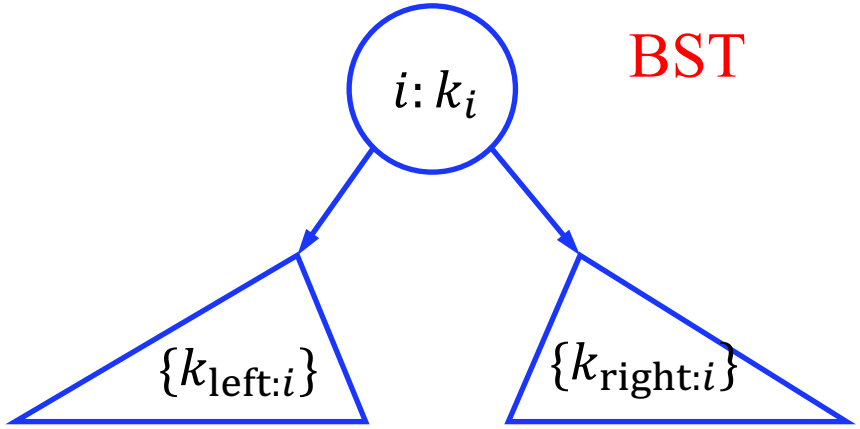
- A binary search tree (**BST**) is a binary tree with the following properties:

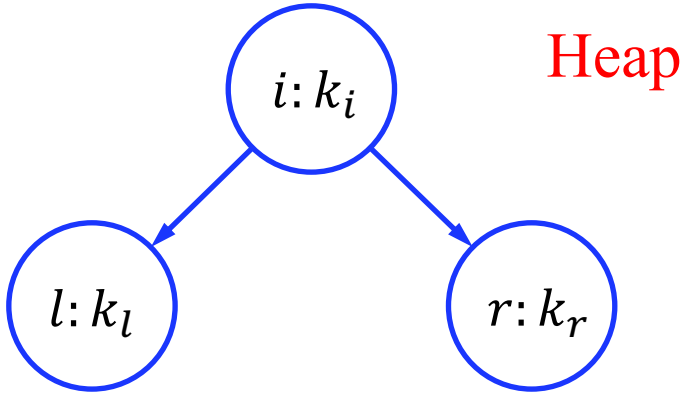
1. keys stored in nodes
2. key of each node is $\geq$ the key of every node in the left subtree
3. key of each node is $\leq$ the key of every node in the right subtree

Binary Search Tree: Left-Right Ordering of Keys

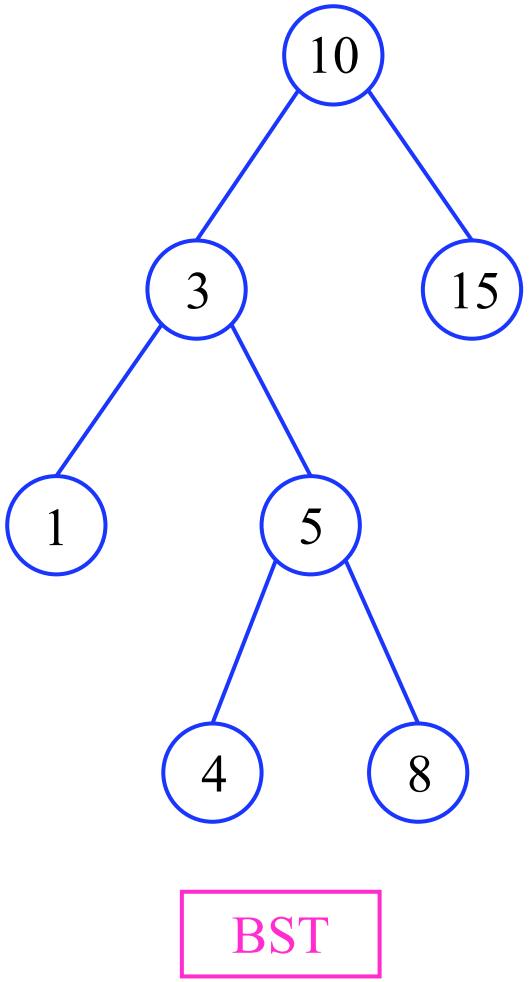
- Left-to-right numerical ordering in a BST: for every node i,
  - the values of all the keys $k_{\text{left:}i}$ in the left subtree are smaller than the key k_i in i and
  - the values of all the keys $k_{\text{right:}i}$ in the right subtree are larger than the key k_i in i:

$$\{k_{\text{left:}i}\} \ni l < k_i < r \in \{k_{\text{right:}i}\}$$

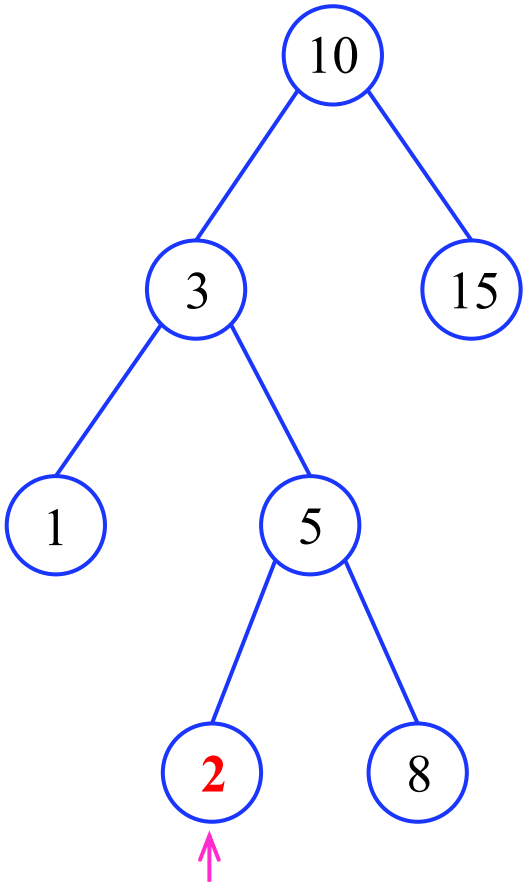




Binary Search Tree: Left-Right Ordering of Keys

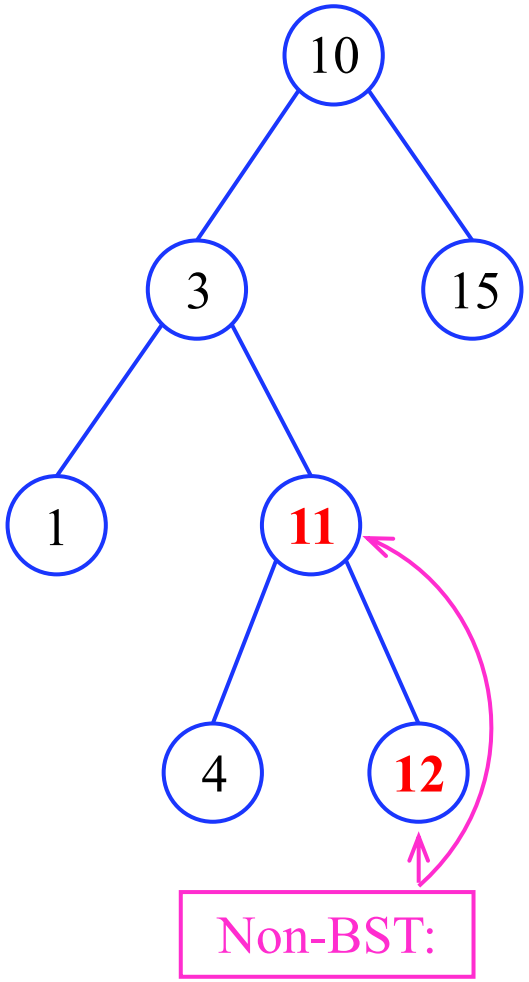


BST



Non-BST:

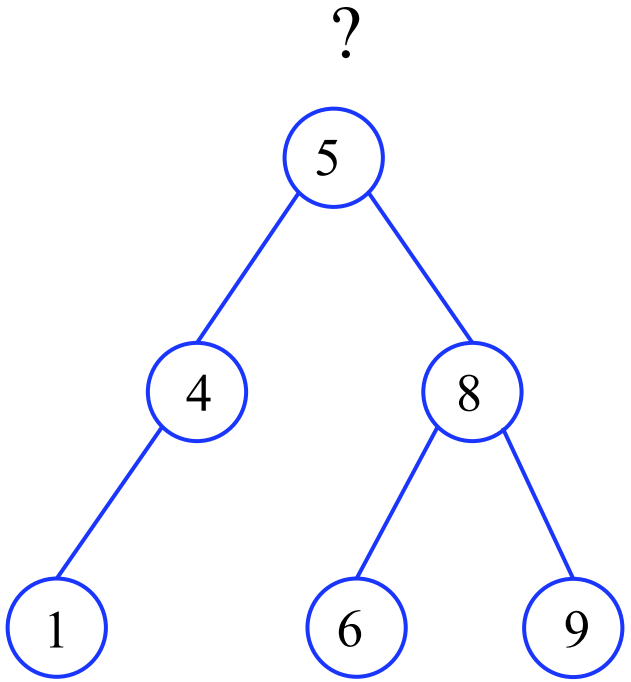
Key "2" cannot be in the right subtree of key "3".

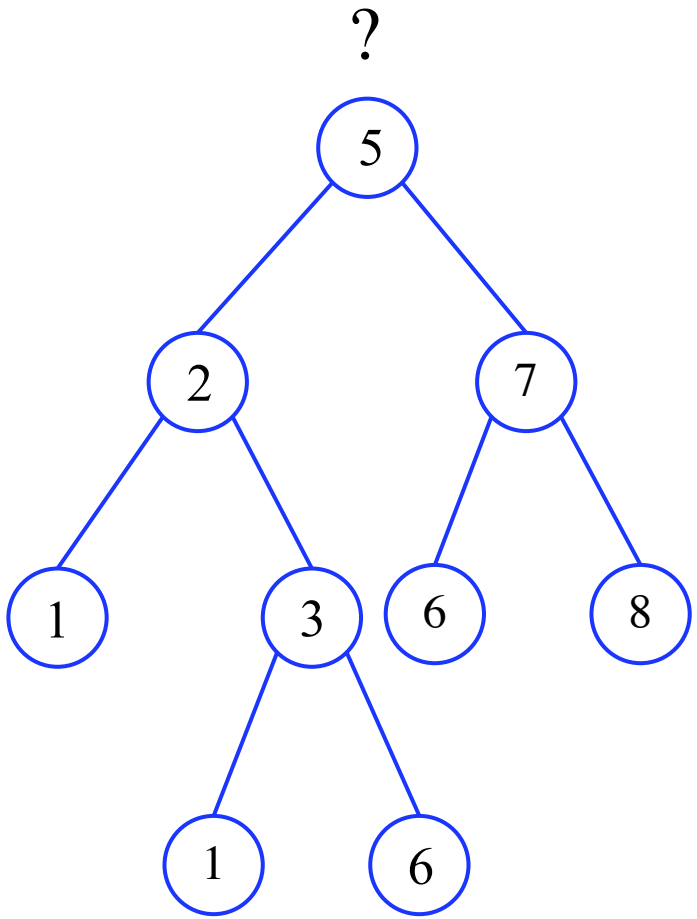


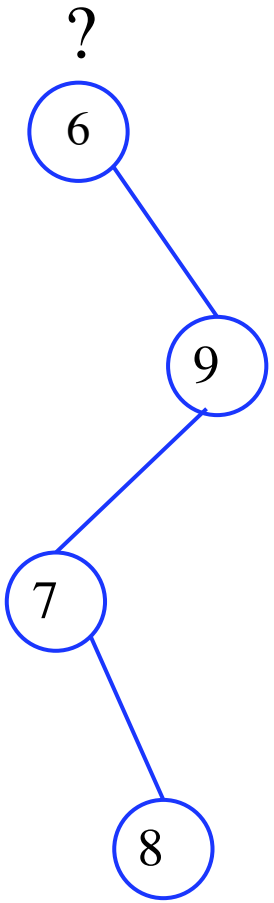
Non-BST:

Key "11" and "12" cannot be in the left subtree of key "10".

Exercise: Which Binary Tree is BST?







Binary Search Tree Operations

- BST is an explicit data structure implementing the table ADT.
  - BST are more complex than heaps: any node may be removed, not only a root or leaves.
  - The only practical constraint: no duplicate keys (attach them all to a single node).

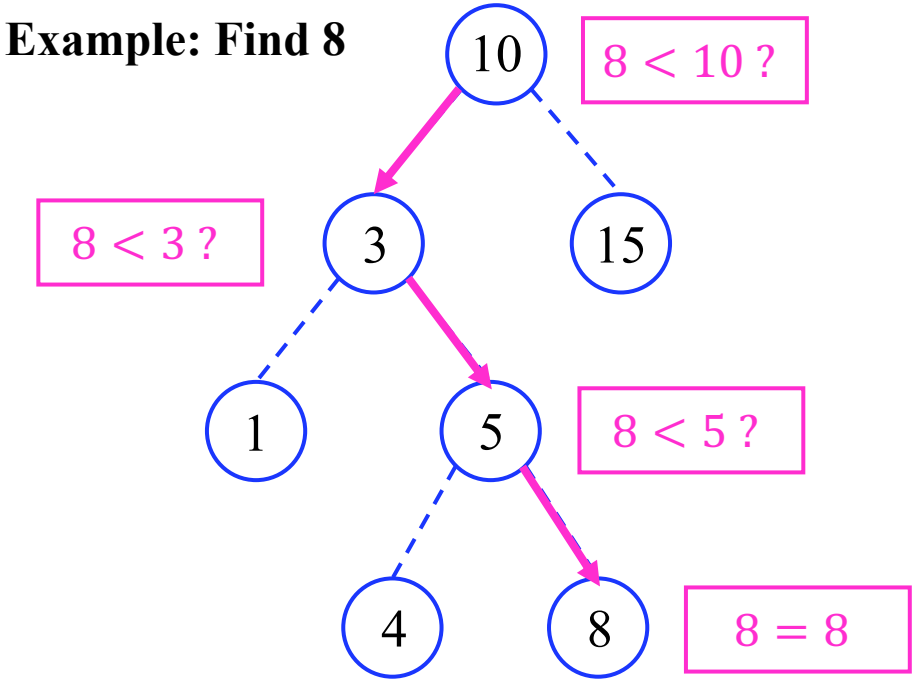
- Basic operations
  - Find a given search key or detect that it is absent in the BST.
  - Insert a node with a given key to the BST if it is not found.
  - FindMin: find the minimum key.
  - findMax: find the maximum key.
  - Remove a node with a given key and restore the BST if necessary.

BST Operations: Find / Insert a Node

find: a successful binary search

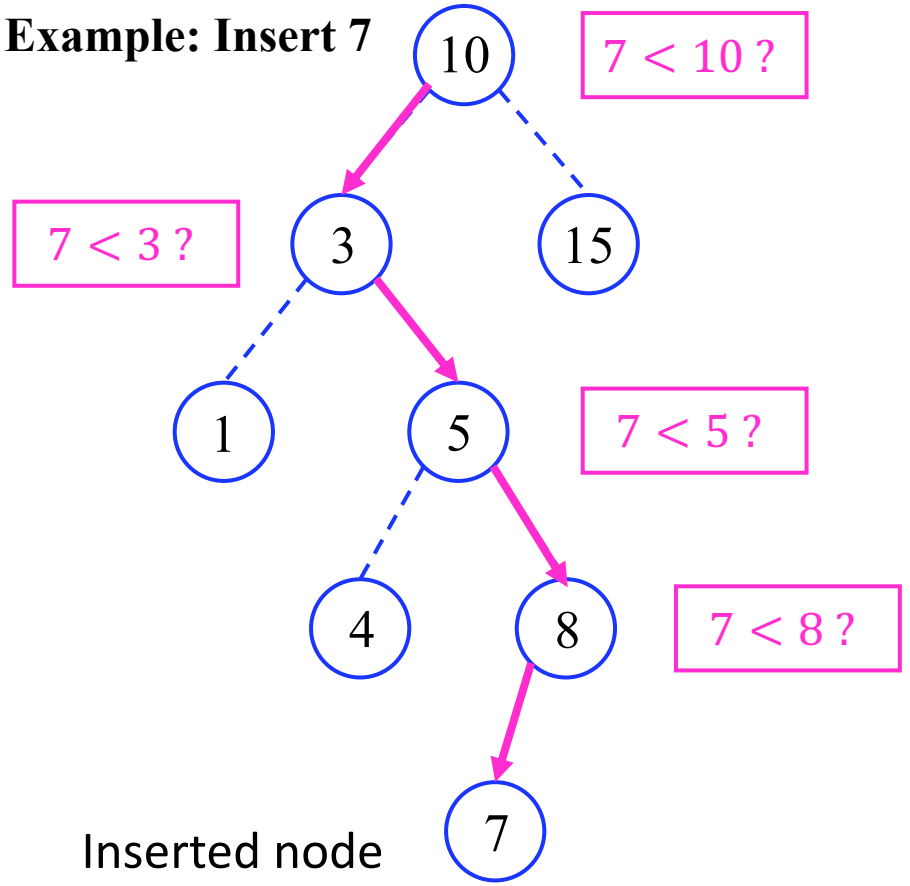
insert: creating a new node at the point where an unsuccessful search stops.

Example: Find 8



Found node

Example: Insert 7



Inserted node

BST Operations: FindMin / FindMax

- Extremely simple: starting at the root, branch repeatedly left (findMin) or right (findMax) if a corresponding child exists.

- The root of the tree plays a role of the pivot in quicksort and quickselect.
- As in quicksort, the in-order traversal of the tree can sort the items:
  - First visit the left subtree;
  - Then visit the root, and
  - Then visit the right subtree.

- $O(\log n)$ average-case and $O(n)$ worst-case running time for find, insert, findMin, and findMax operations, as well as for selecting a single item

BST Operations: Remove a Node

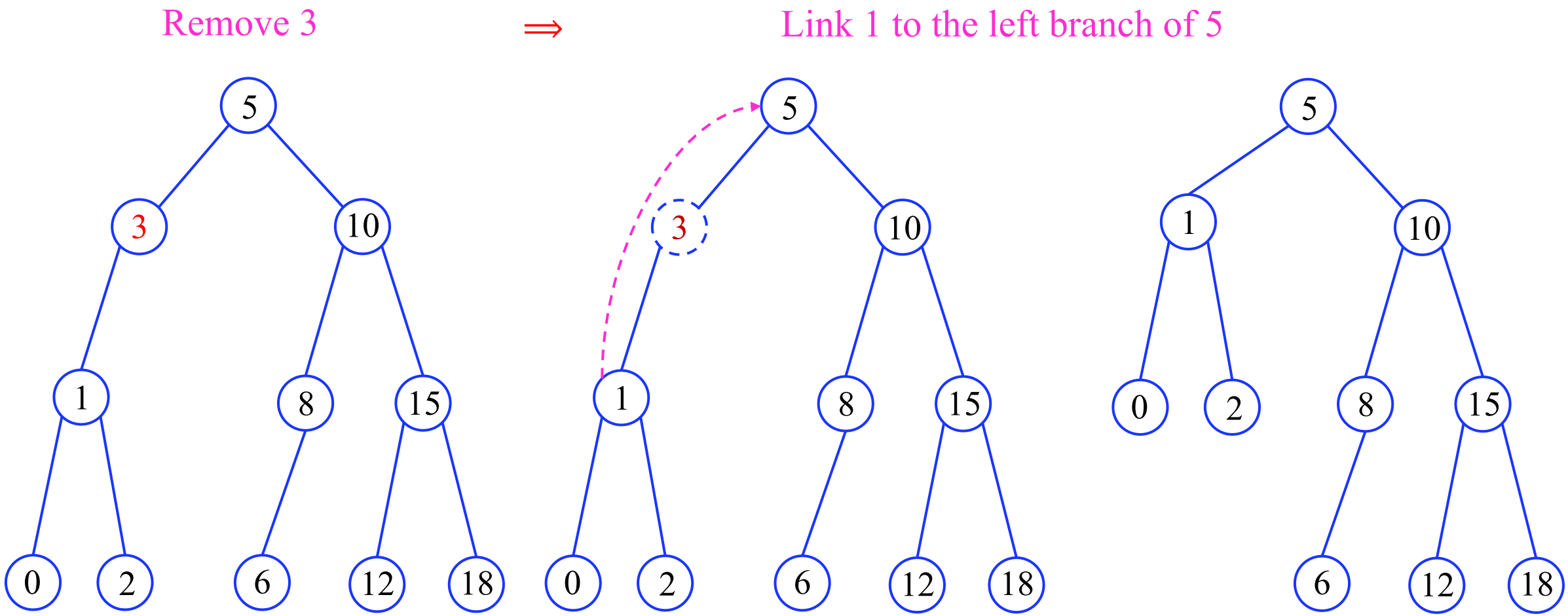
- The most complex because the tree may be disconnected. Need to reconnect some nodes!
  - Reconnection must retain the ordering condition.
  - Reconnection should not needlessly increase the tree height.

BST Operations: Remove a Node

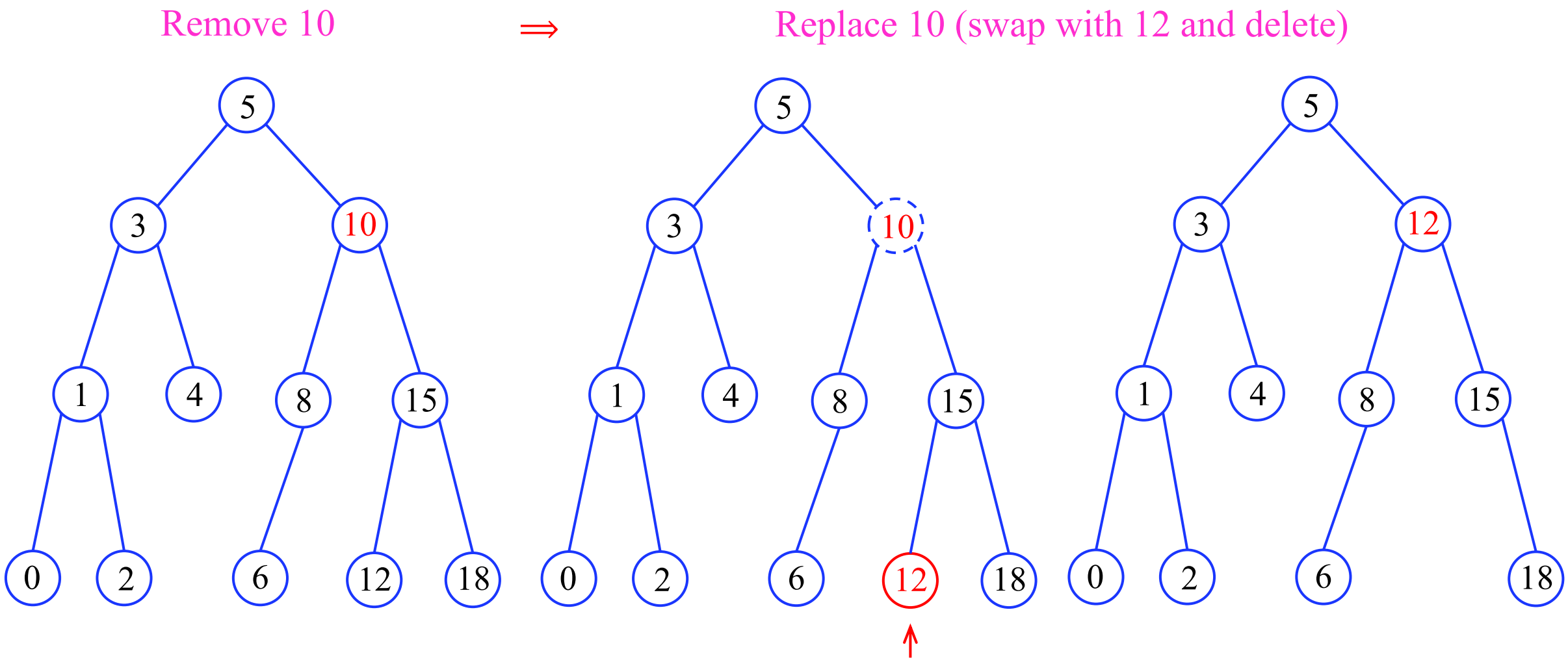
- Standard method of removing a node i with c children:

c	ACTION
0	Simply remove the leaf i.
1	Remove the node i after linking its child to its parent node.
2	Swap the node i with the node j having the smallest key k_j in the right subtree of the node i. After swapping, remove the node i (as now it has at most one right child).

BST Operation: Remove a Node



BST Operation: Remove a Node



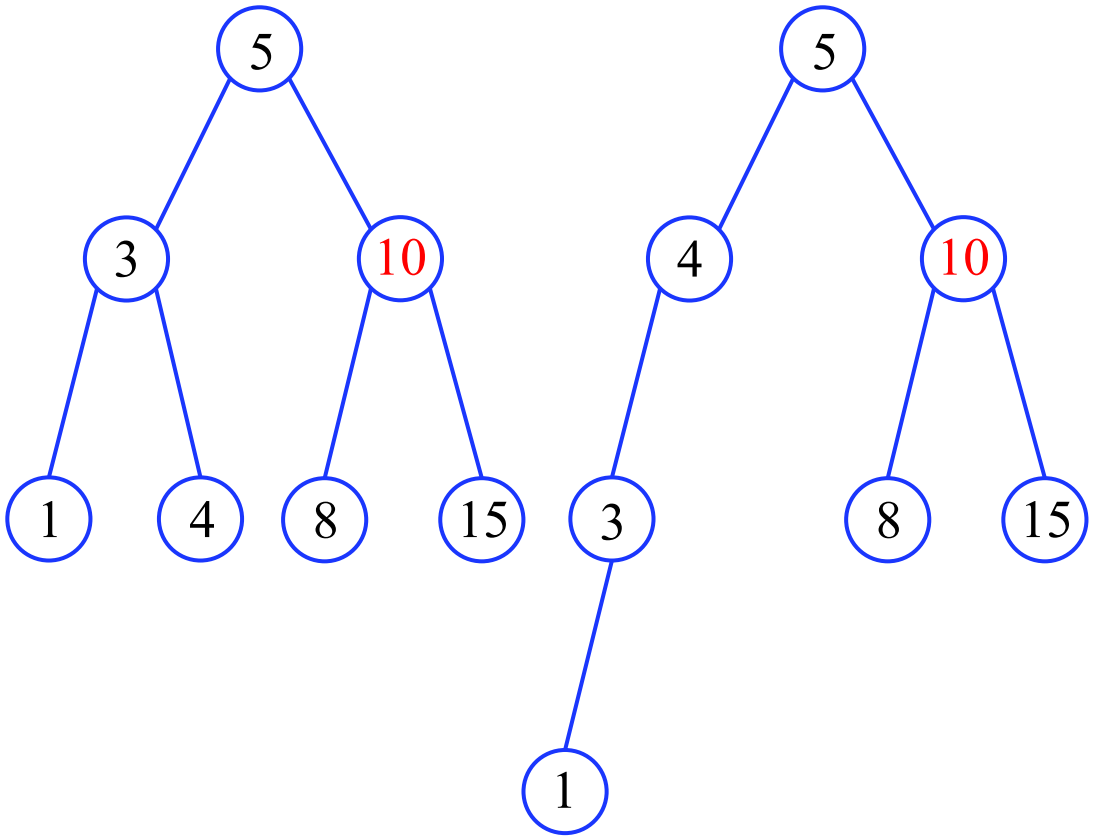
The Worst-Case Time Complexity

- The find, insert, and remove operations in a BST all take time in $O(h)$ in the worst case, where h is the height of the tree

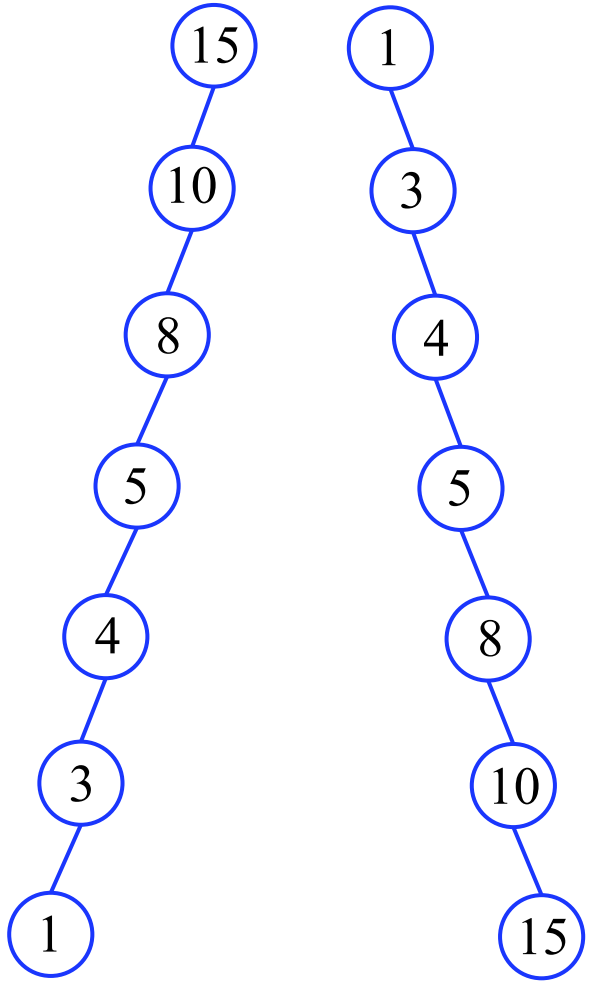
- **Proof**: The running time $T(n)$ of these operations is proportional to the number of nodes visited
  - Find / insert: 1+h
  - Remove: "1 + the depth of the node + the height of its highest subtree" →1+h
  - In each case $T(n) = \Theta(h)$
  - For a well-balanced BST, $T(n) \in O(\log n)$ (logarithmic time)
  - In the worst case $T(n) \in \Theta(n)$ (linear time) because insertions and deletions may heavily destroy the balance

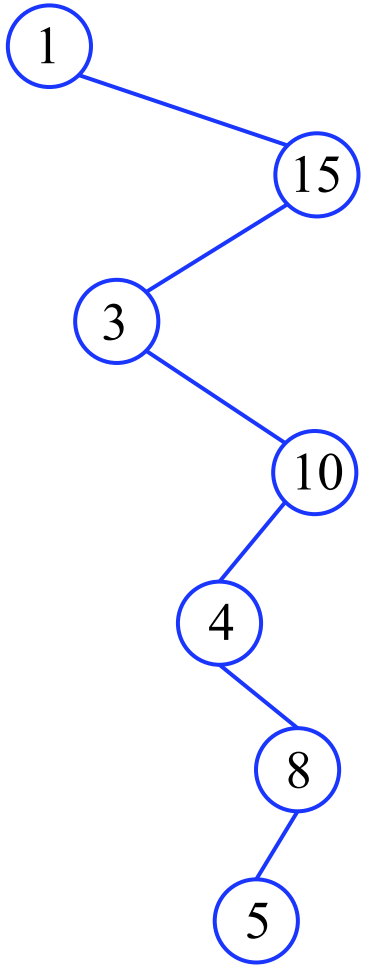
The Worse-Case Time Complexity

BSTs of height $h \approx \log n$



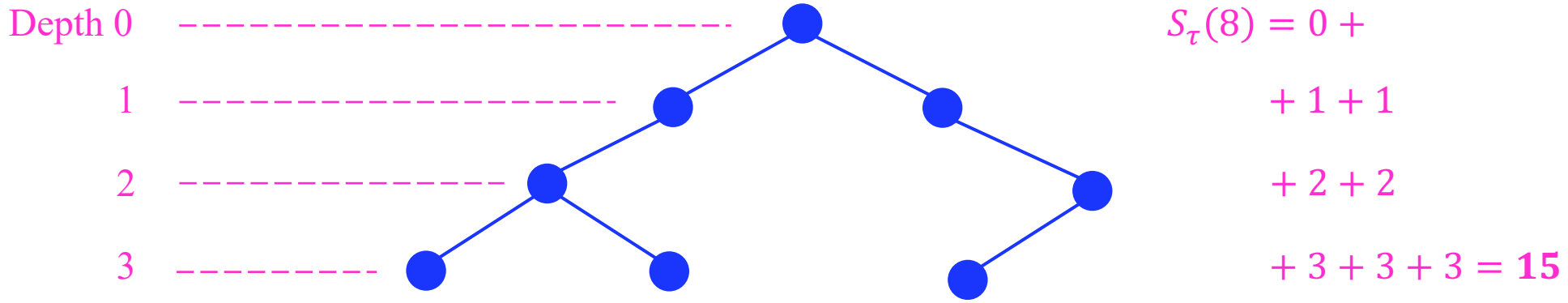
BSTs of height $h \approx n$





The Average-Case Time Complexity

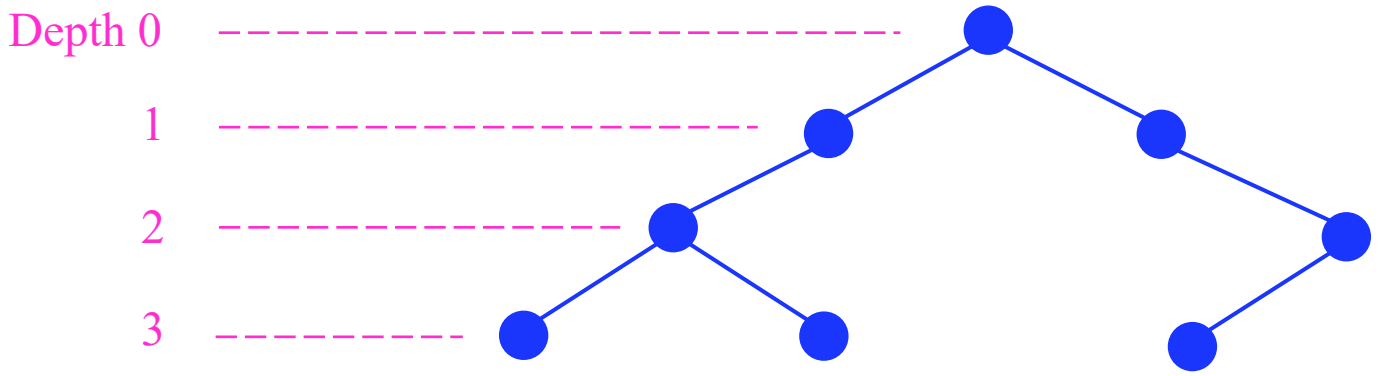
- More balanced trees are more frequent than unbalanced ones.
- **Definition** (**Internal Path Length**): The total internal path length, $S_\tau(n)$, of a binary tree τ is the sum of the depths of all its nodes.



- Average complexity of a successful search in τ: the average node depth, $1/n\ S_\tau(n)$, e.g. 1/8 $S_\tau(8)$ =15/8=1.875 in this example.

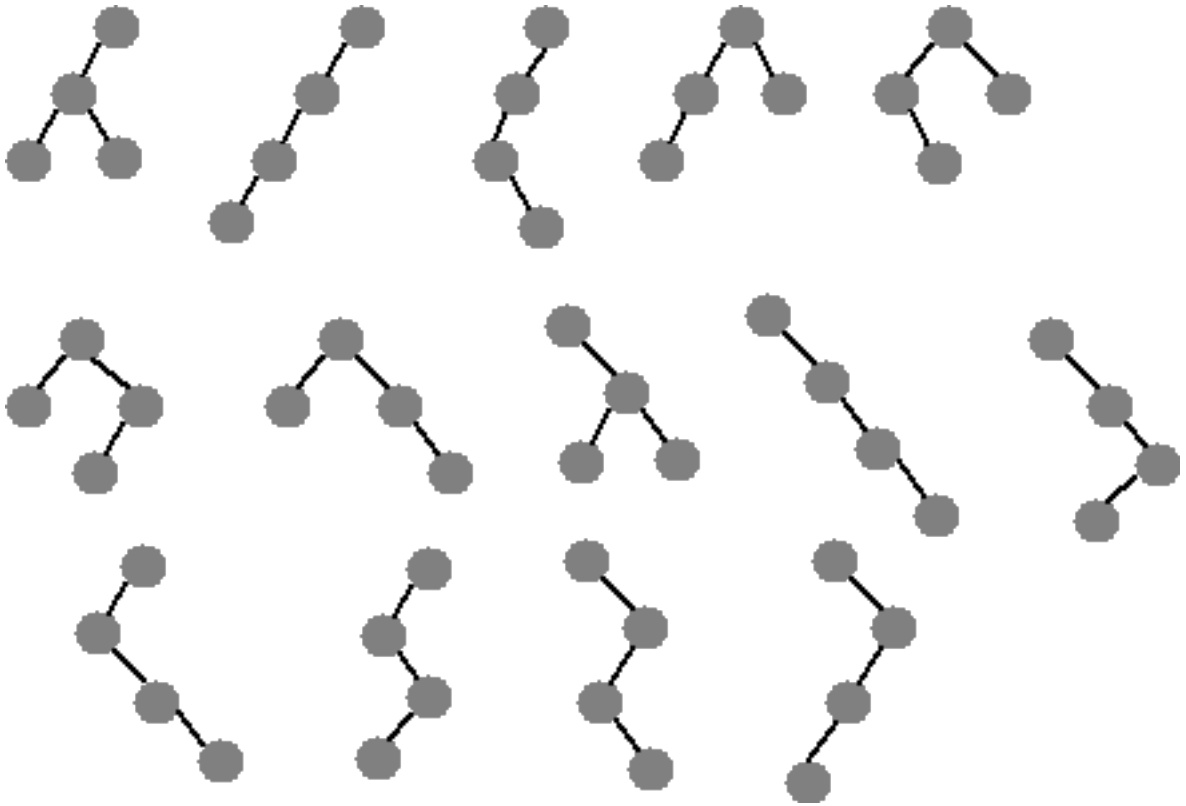
The Average-Case Time Complexity (Contd.)

- Average-case complexity of searching:
  - Averaging $S_\tau(n)$ for all the trees of size n, i.e. for all possible $n!$ insertion orders, occurring with equal probability $\frac{1}{n!}$



$$S_\tau(8) = 0 +$$
$$+ 1 + 1$$
$$+ 2 + 2$$
$$+ 3 + 3 + 3 = \mathbf{15}$$

Example: All possible BSTs with 4 nodes [1,2,3,4]



The $\Theta(\log n)$ Average-case BST Operations

- Let $S(n)$ be the average of the total internal path length, $S_\tau(n)$, over all BST τ created from an empty tree by sequences of n random insertions, each sequence considered as equally possible.

- The expected time for successful and unsuccessful search (insertion and deletion) in such BST is $\Theta(\log n)$
- **Proof**: It should be proven that $S(n) \in \Theta(n \log n)$
  - Obviously, $S(1) = 0$.
  - Any n-node tree, n>1, contains a left subtree with i nodes, a root at level 0, and a right subtree with $n - i - 1$ nodes; $0 \leq i \leq n - 1$.
  - For a fixed i, $S(n) = (n - 1) + S(i) + S(n - i - 1)$, as the root adds 1 to the path length of each other node.

The $\Theta(\log n)$ Average-case BST Operations (Contd.)

- After summing these recurrences for $0 \leq i \leq n-1$ and averaging, just the same recurrence as for the average-case quicksort analysis is obtained:

$$S(n) = (n-1) + \frac{2}{n}\sum_{i=0}^{n-1} S(i)$$

- Therefore, $S(n) \in \Theta(n \log n)$, and the expected depth of a node is $\frac{1}{n}S(n) \in \Theta(\log n)$.
- Thus, the average-case search and insertion time is in $\Theta(\log n)$.
- It is possible to prove (but in a more complicate way) that the average-case deletion time is also in $\Theta(\log n)$.
- The BST allow for a special balancing, which prevents the tree height from growing too much, i.e. avoids the worst cases with linear time complexity $\Theta(n)$.

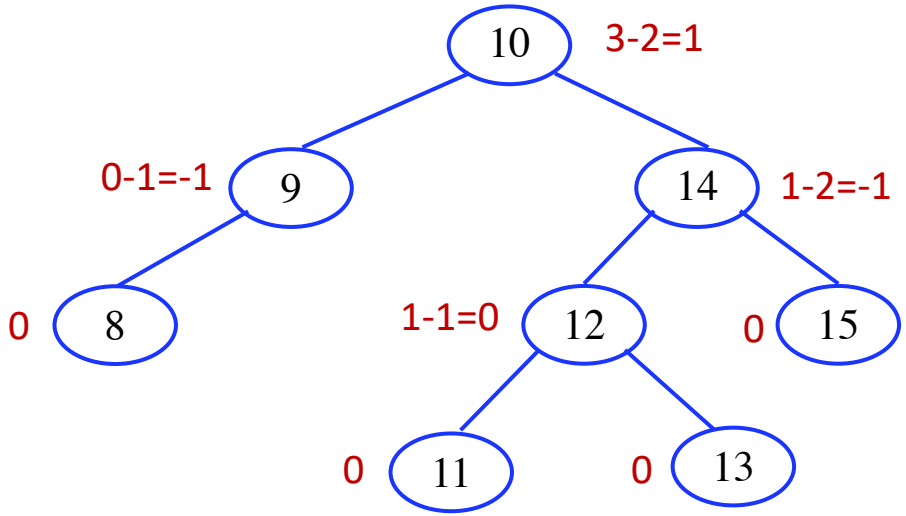
Rebalancing BST: Simple Fix

- Insertion and deletion running time depends on the height of a tree.
- Inserting and deleting elements in a BST can destroy the balance of a tree!
- **Simple fix**. Rebalance the tree after deleting a node
  - If we ALWAYS choose the maximum key in the left subtree
  - If we ALWAYS choose the minimum key in the right subtree
  - We can alternate sides, or choose a side randomly, In this case a tree will more likely result in a more balanced BST but it does not fix the problem entirely!

Self-balancing BST: AVL Tree

- **AVL tree** is a binary search tree with the additional balance property that, for any node in the tree, the heights of the left and right subtrees can differ by at most 1

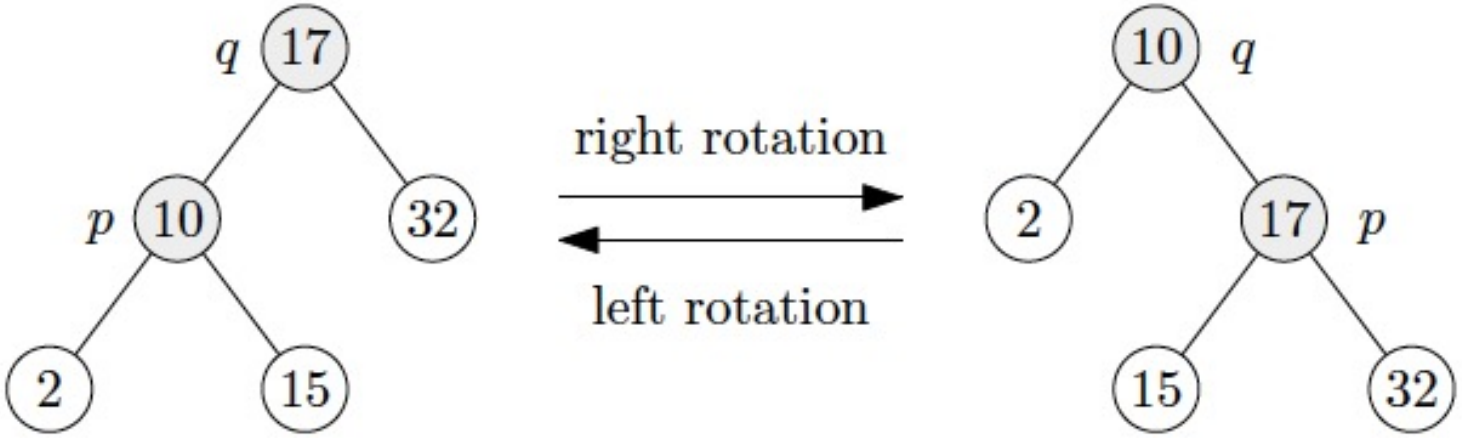
- The **balance** of a node is defined to be the difference between heights of its right subtree and left subtree.



- It is a BST
- It is an AVL Tree

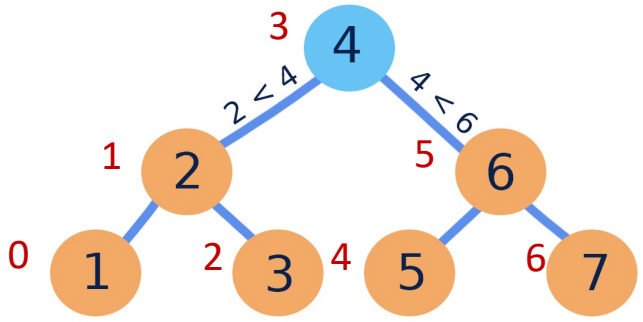
Example: Self-balancing Operations

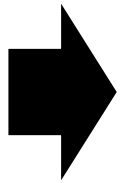
- BST Rotations



Implementation of BST

- **BST as an array**. We can recover the sorted list by reading the keys according to an in-order traversal
  1. Start with the leftmost node
  2. If it has a child, then go to the child and then to step 1
  3. If it does not have a child, then go to the parent and then to step 1





[1, 2, 3, 4, 5, 6, 7]

0 1 2 3 4 5 6

In Order Traversal: 1 2 3 4 5 6 7

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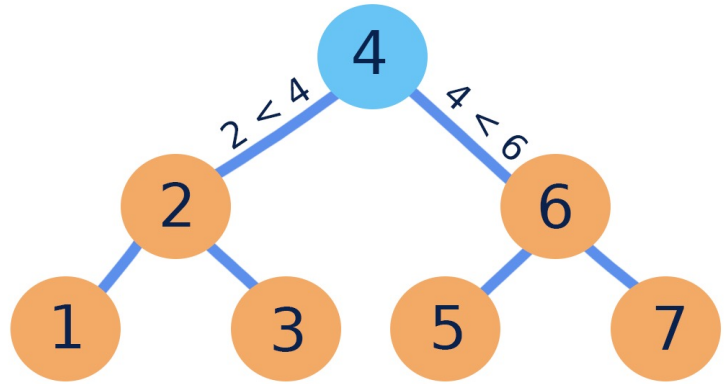
SUMMARY

- Tree Data Structure
- Binary Search Tree Operations
  - find, insert, and remove
- Time Complexity Analysis
  - Worse and average case
- Self-balancing BST: AVL Tree
- BST implementation



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