



[SWE2015-41] Introduction to Data Structures (자료구조개론)

Binary Search Trees

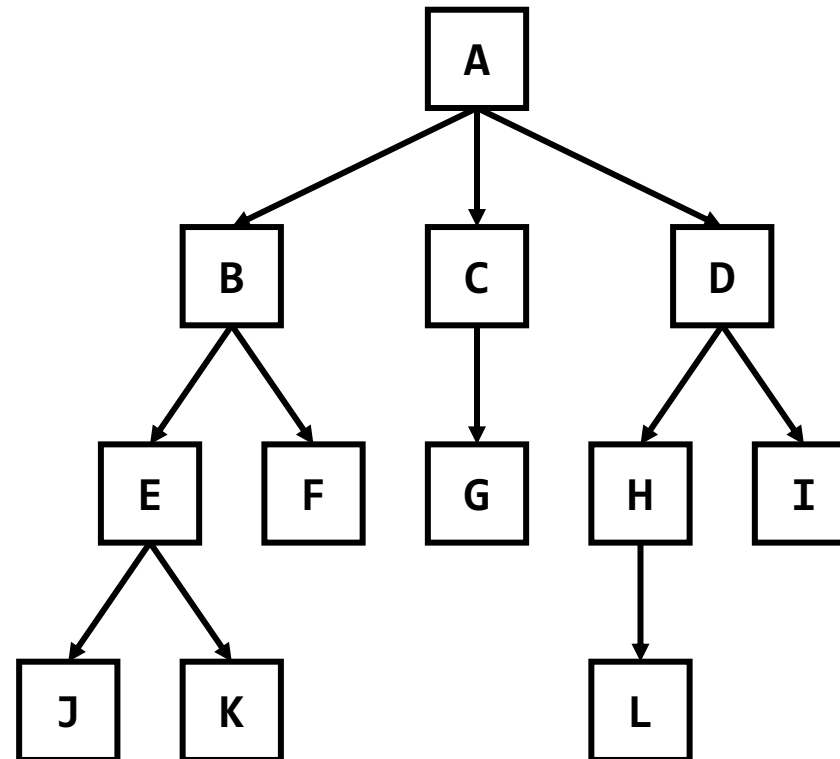
Department of Computer Science and Engineering

Instructor: Hankook Lee (이한국)

(Recap) What is Tree?



- Tree is a **hierarchical** structure with a set of connected nodes
 - Each node is composed with a **parent-children relationship**
 - There is no cycle (or loop) in the tree



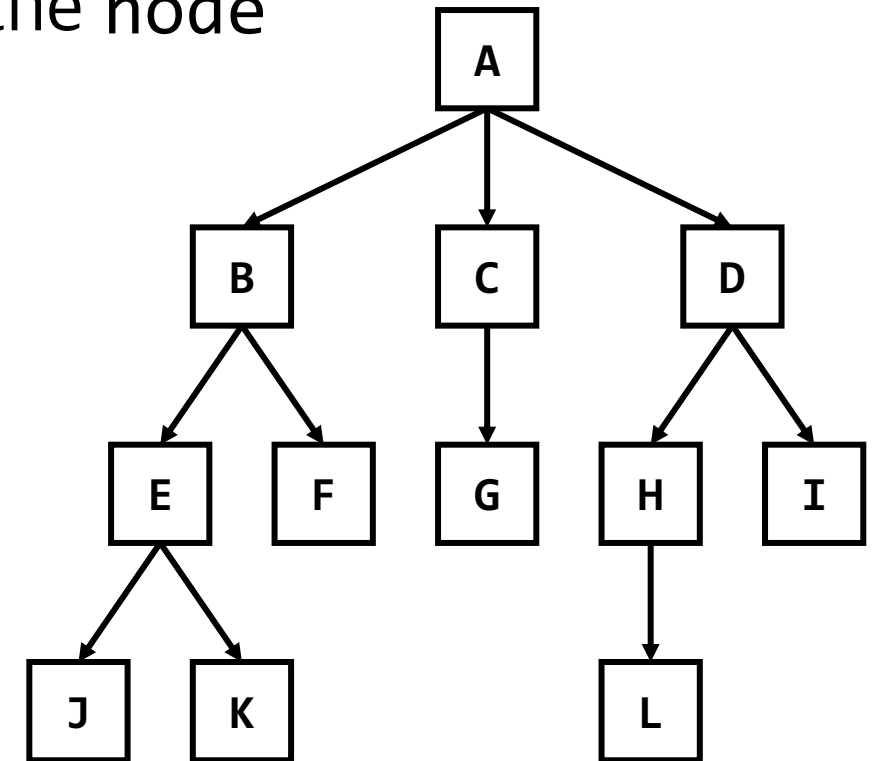
(Recap) Terminology (Basic)



- **Node** represents an object
- **Edge** represents a connection between two nodes
 - If $X \rightarrow Y$, say X is the **parent** of Y and Y is a **child** of X
- **Degree** of a node is the number of children of the node
 - It is equal to the number of outgoing edges

- **Examples**

- B is the parent of E and F
- H is a child of D
- $\text{degree}(D) = 2$
- $\text{degree}(J) = 0$



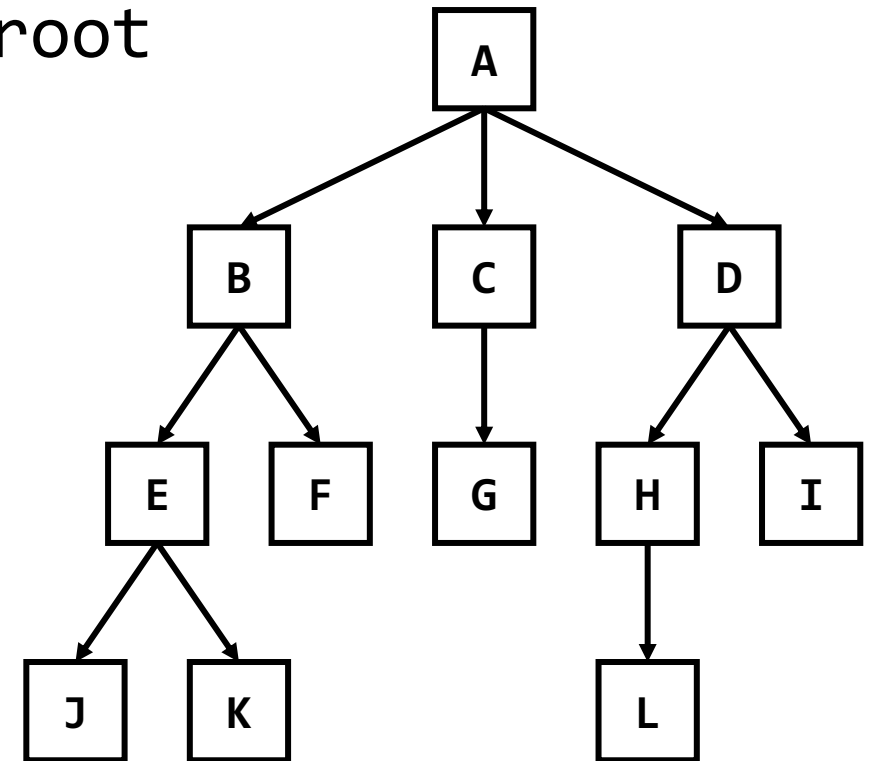
(Recap) Terminology (Tree-Level)



- **Root** is the top node in a tree
- **Internal** (or non-terminal) node: $\text{degree} \geq 1$
- **Leaf** (or terminal) node: $\text{degree} = 0$
- **Height** is # of nodes on the longest path from root

- Examples

- A is the root of the tree
- Internal nodes are A, B, C, D, E, H
- Leaf nodes are F, G, I, J, K, L
- The height of the tree is 4



(Recap) Terminology (Node-Level)

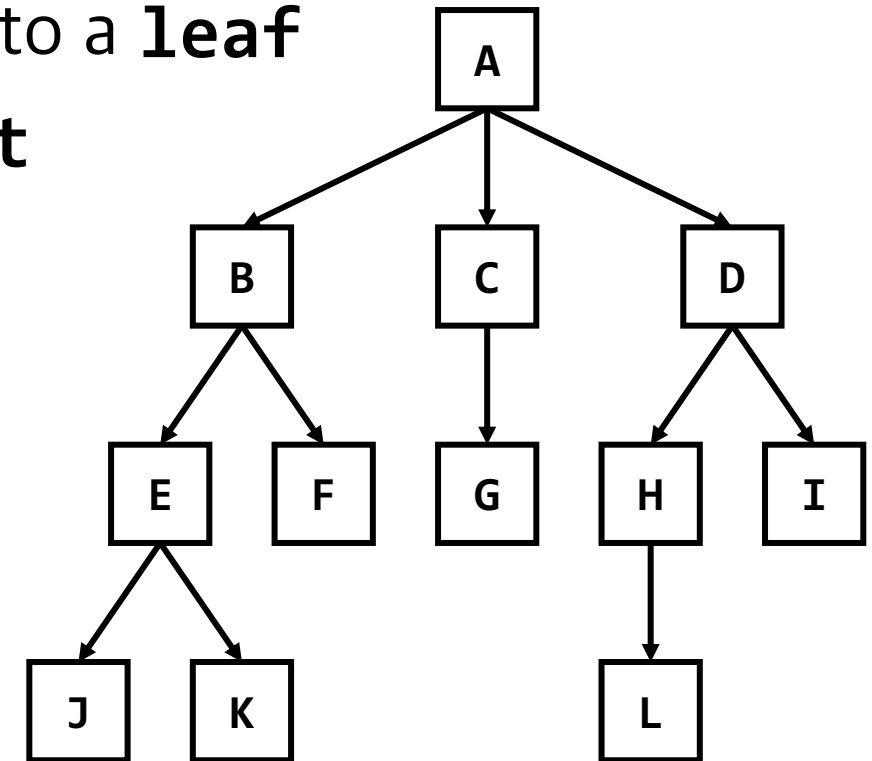


For a **node X**,

- **Level** or **depth** is the distance between **root** and **X**
- **Ancestor** is a predecessor on the path from **root** to **X**
- **Descendant** is a successor on any path from **X** to a **leaf**
- **Sibling** is another **node** with the same **parent**

- Examples

- **A**'s level/depth is 0
- **F**'s level/depth is 2
- **A** and **B** are **ancestors** of **E**
- **E**, **F**, **J**, and **K** are **descendants** of **B**
- **B** and **D** are **siblings** of **C**



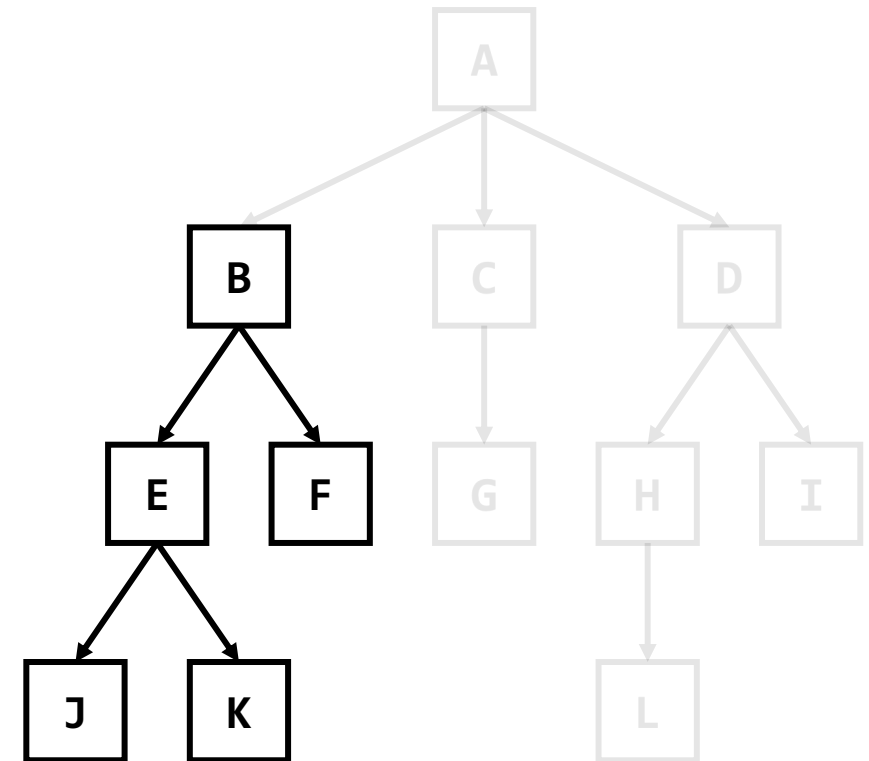
(Recap) Terminology (Node-Level)



Subtree rooted at a **node X**

- Any **node** can be treated as the **root node** of its own **subtree**
- The **subtree** includes **X** and all **descendants** of **X**

Subtree rooted at **node B**

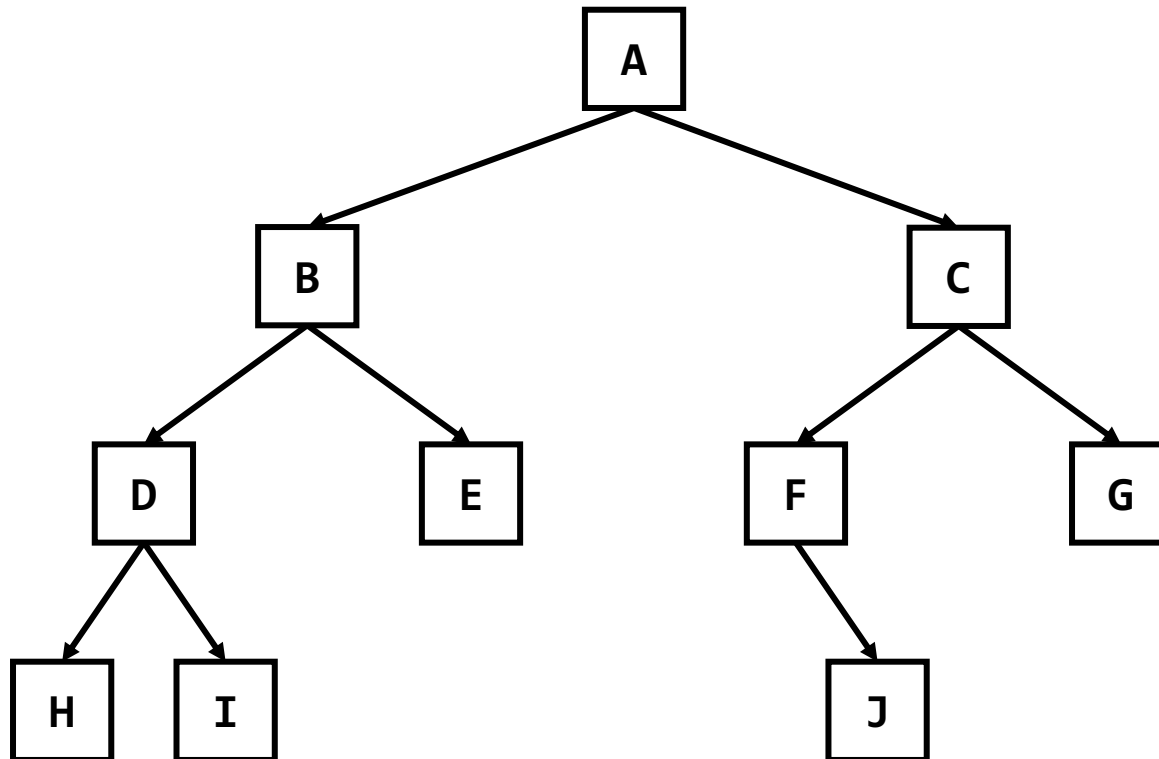


(Recap) Binary Trees

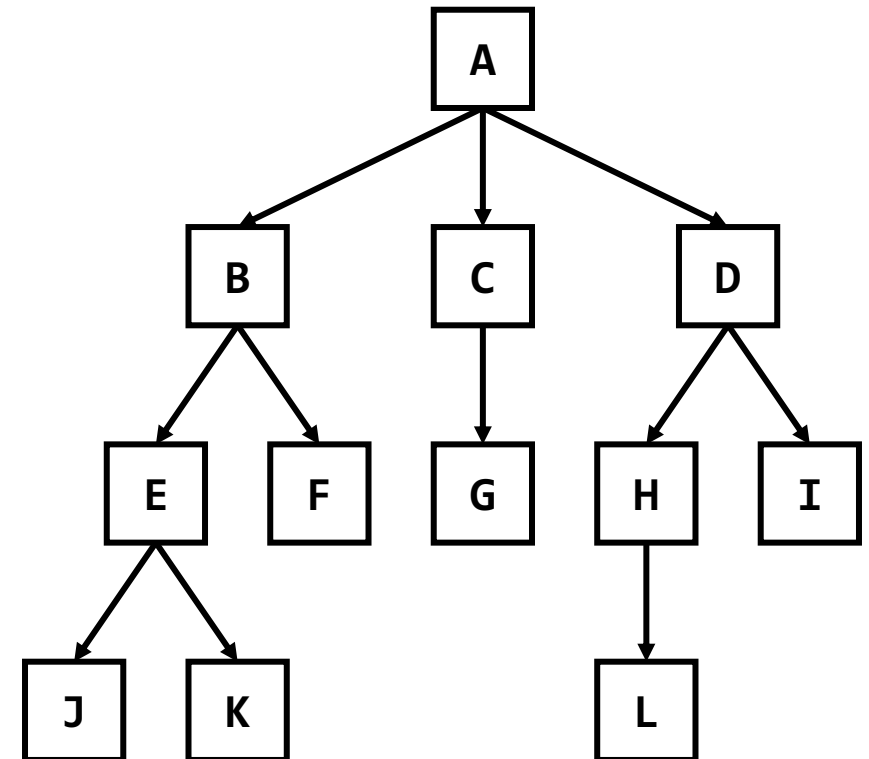


- **Binary Tree** is a tree in which each node has at most two children
 - $\text{degree}(X) \leq 2$ for any node **X** in a binary tree

Binary



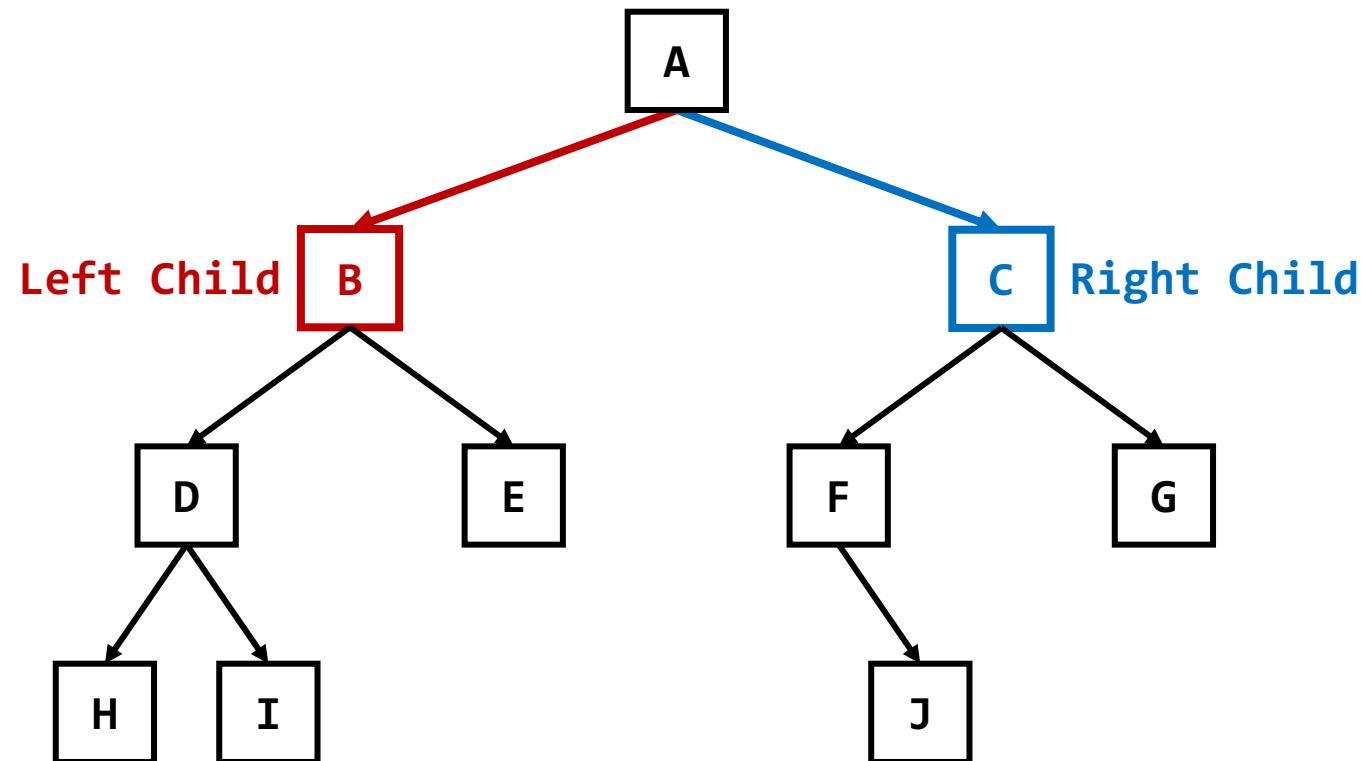
NOT Binary



(Recap) Binary Trees



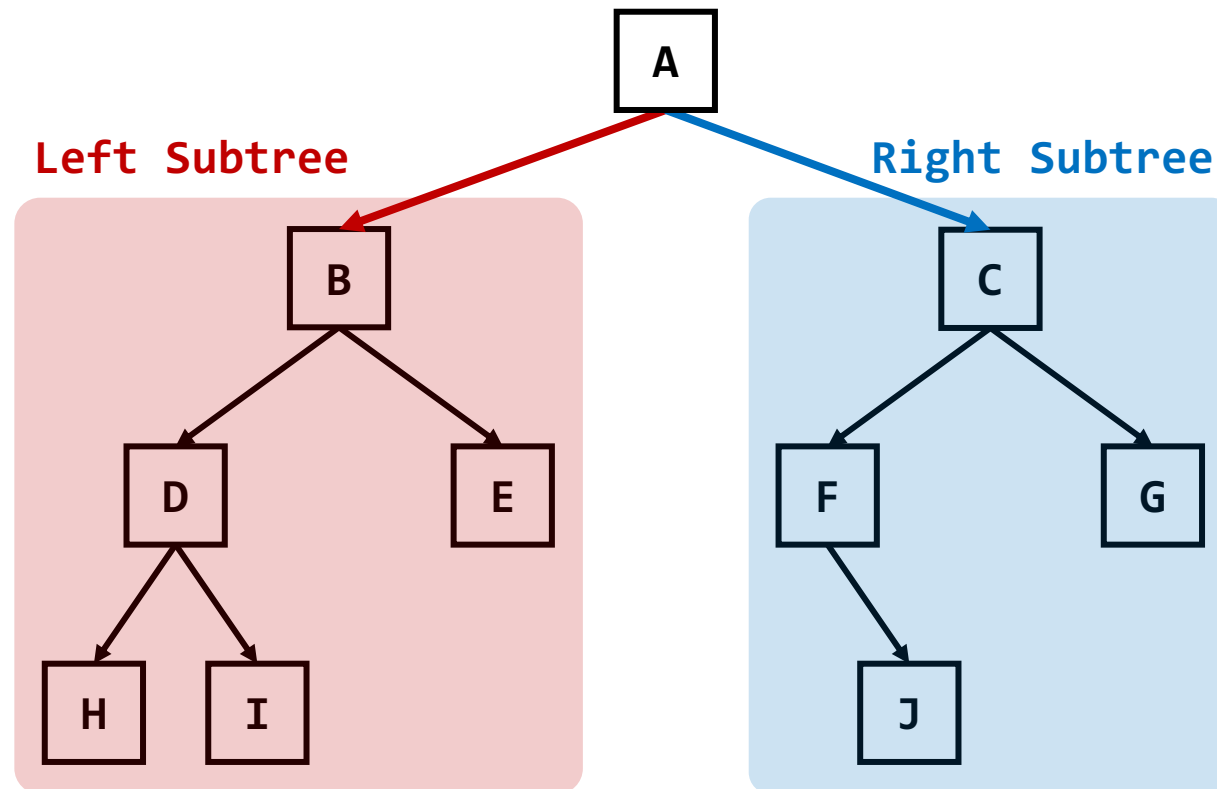
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 - Each node has **left** & **right** children



(Recap) Binary Trees



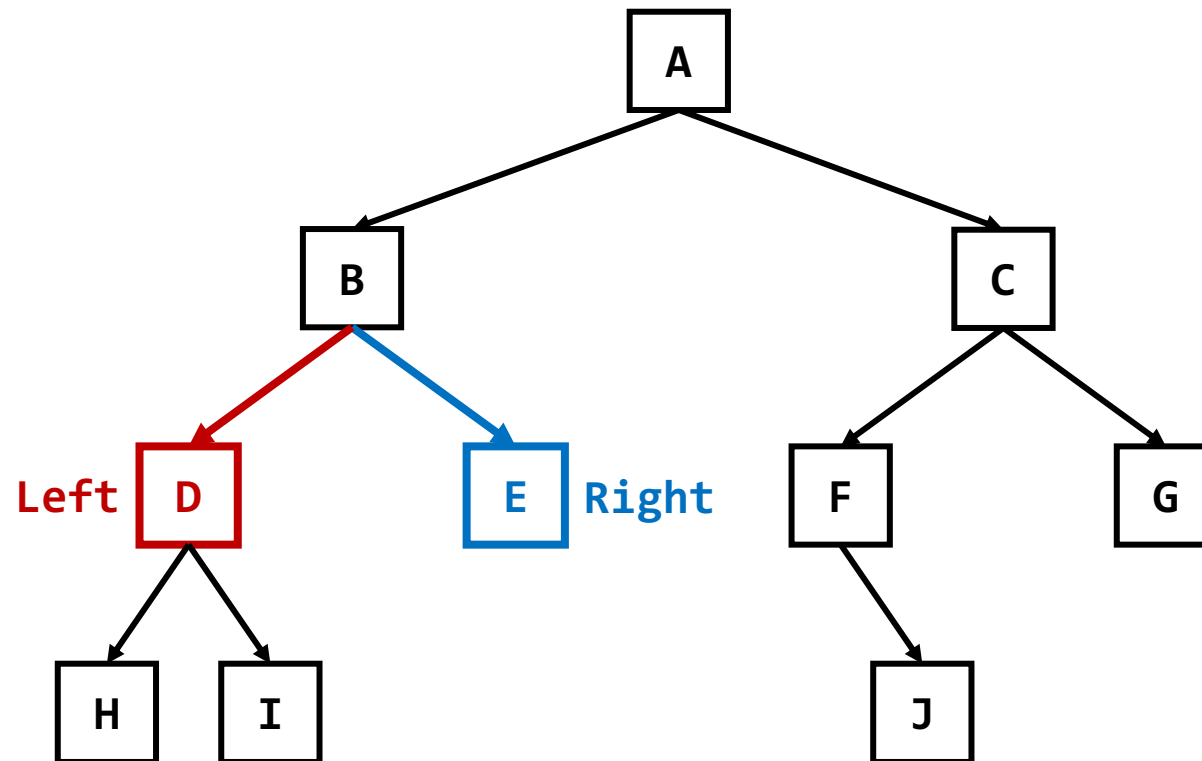
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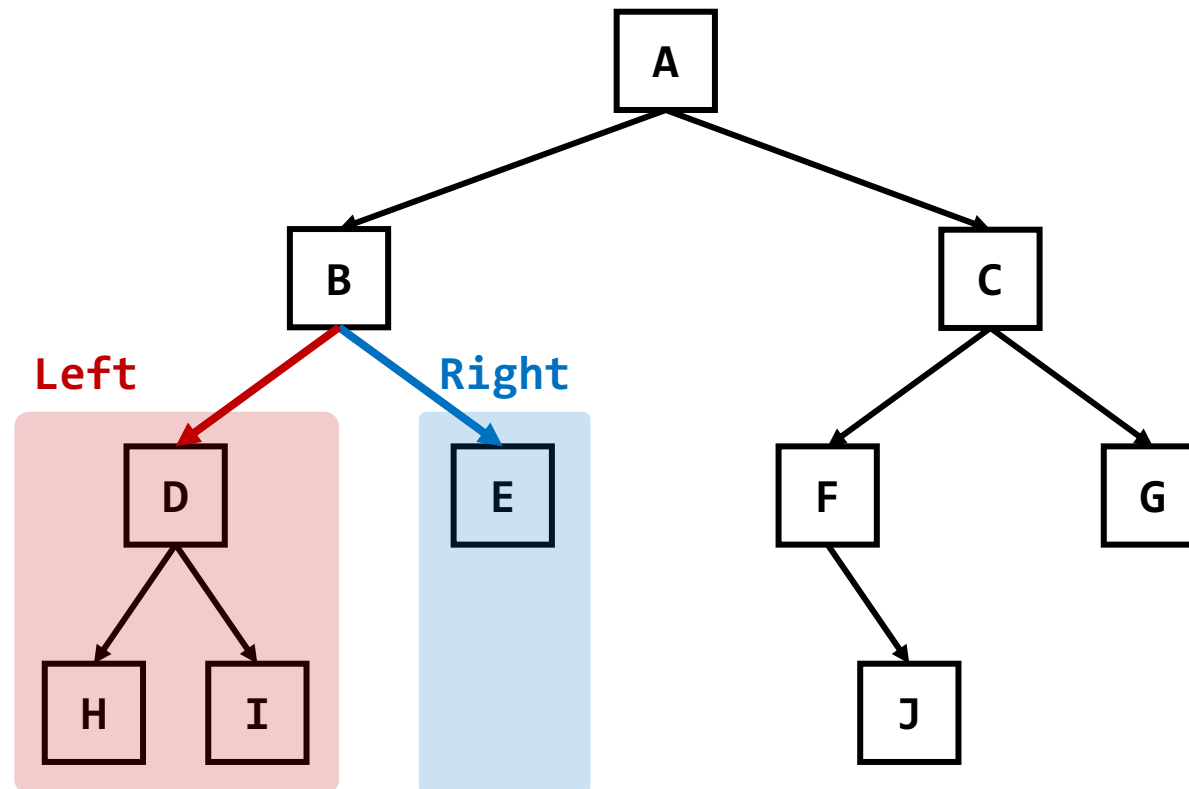
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(Recap) Binary Tree Implementation



```
typedef struct _Node {  
    int item;  
    struct _Node *left, *right;  
} Node;
```

- In general, **the (linked-)list structure** is suitable for BT implementation
 - The tree is **non-linear** structure, which is not fit with the array structure
 - Since degree ≤ 2 , the node structure can be easily implemented
 - Insertion and deletion are easier to implement

(Recap) Binary Tree Implementation



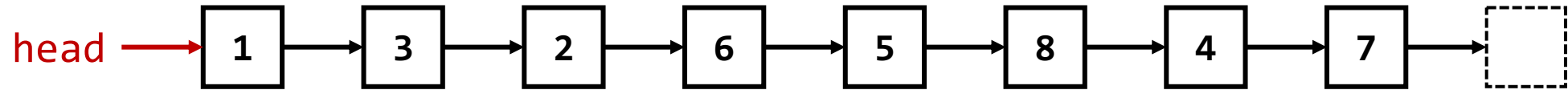
```
typedef struct _Node {  
    int item;  
    struct _Node *left, *right, *parent;  
} Node;
```

- In general, **the (linked-)list structure** is suitable for BT implementation
 - The tree is **non-linear** structure, which is not fit with the array structure
 - Since degree ≤ 2 , the node structure can be easily implemented
 - Insertion and deletion are easier to implement
- The **parent node** pointer is sometimes useful for ...
 - tree modification
 - traversal from bottom to top (child \rightarrow parent)

Binary Search Trees (BSTs)



- A linked list is **inefficient in searching** an item

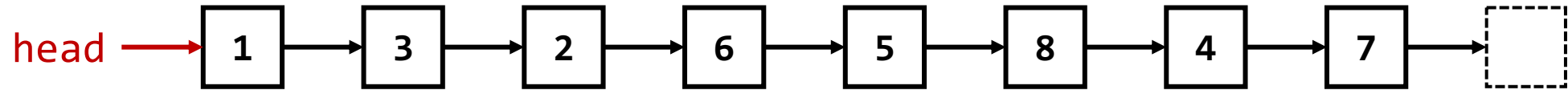


- **(Q)** How to search the item of 5 in the above list?
- **(Q)** What is the time complexity of the search?

Binary Search Trees (BSTs)



- A linked list is **inefficient in searching** an item

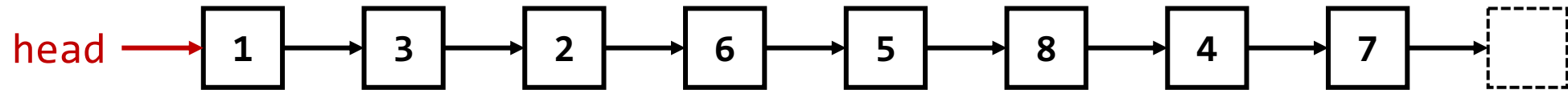


- **(Q)** How to search the item of 5 in the above list?
- **(A)** You must traverse the items from the first to the last sequentially
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- **(A)** $O(N)$ where N is the number of items

Binary Search Trees (BSTs)



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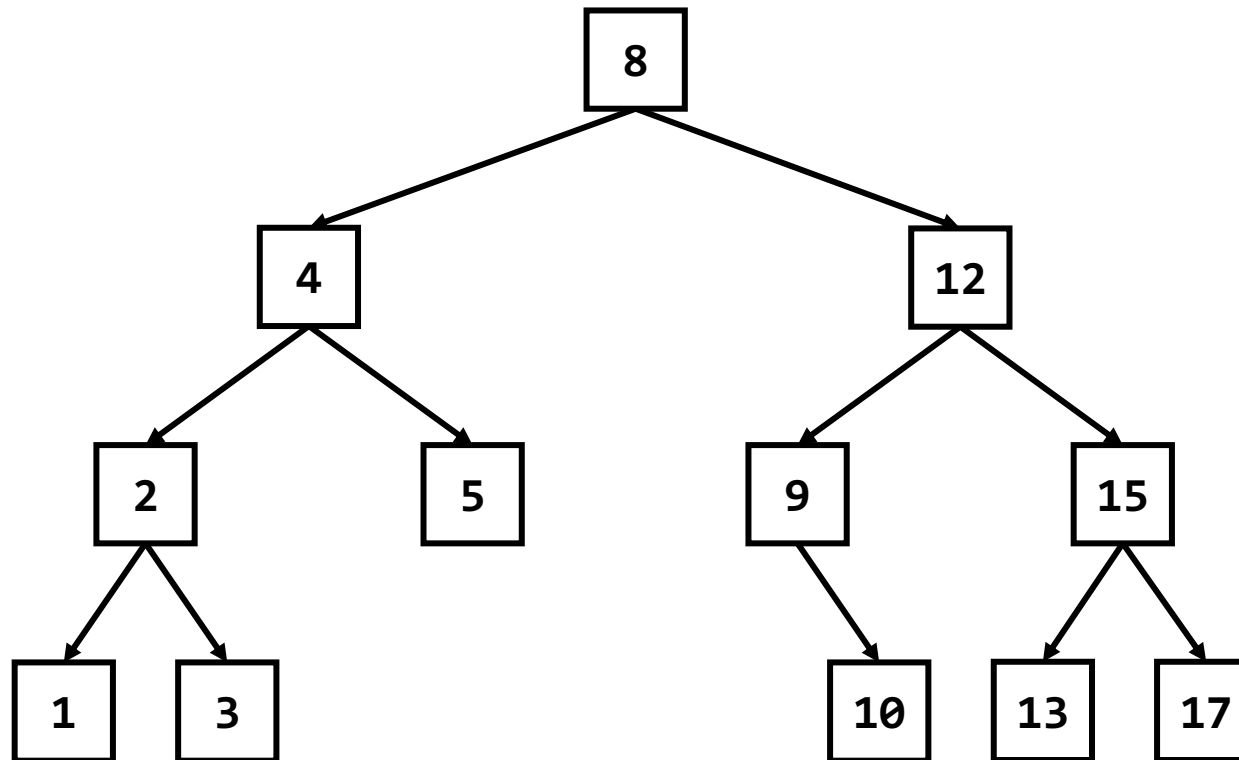


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 - **(A)** You must traverse the items from the first to the last sequentially
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 - **(A)** $O(N)$ where N is the number of items
- **Binary Search Tree (BST)** is an **efficient tree structure** for search

Binary Search Trees (BSTs)



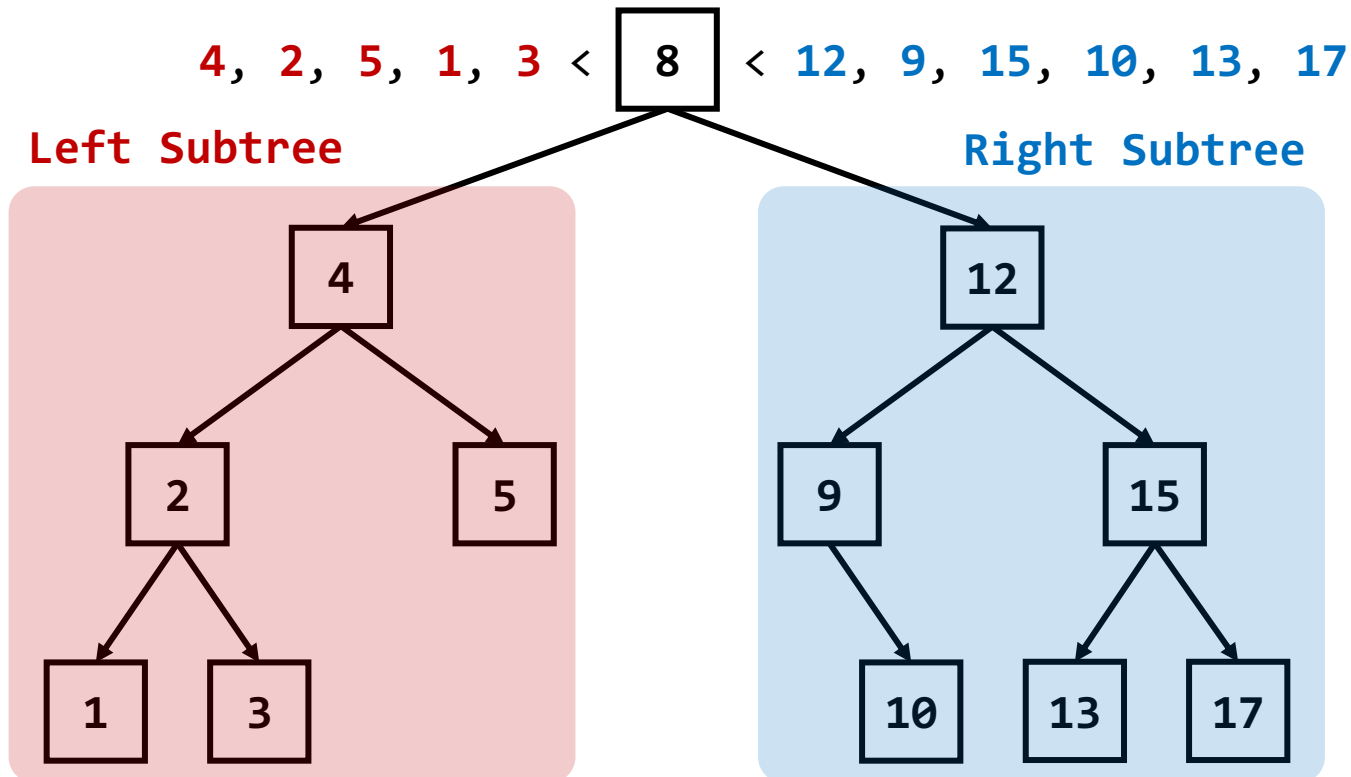
- **Binary Search Tree (BST)** satisfies the following conditions:
 1. Any two nodes **A** and **B** are comparable: **A** < **B**, **A** > **B**, or **A** == **B**
 - E.g., you can compare numbers numerically or strings in the alphabetical/dictionary order
 - Such a comparable value of a node is called **KEY** value



Binary Search Trees (BSTs)



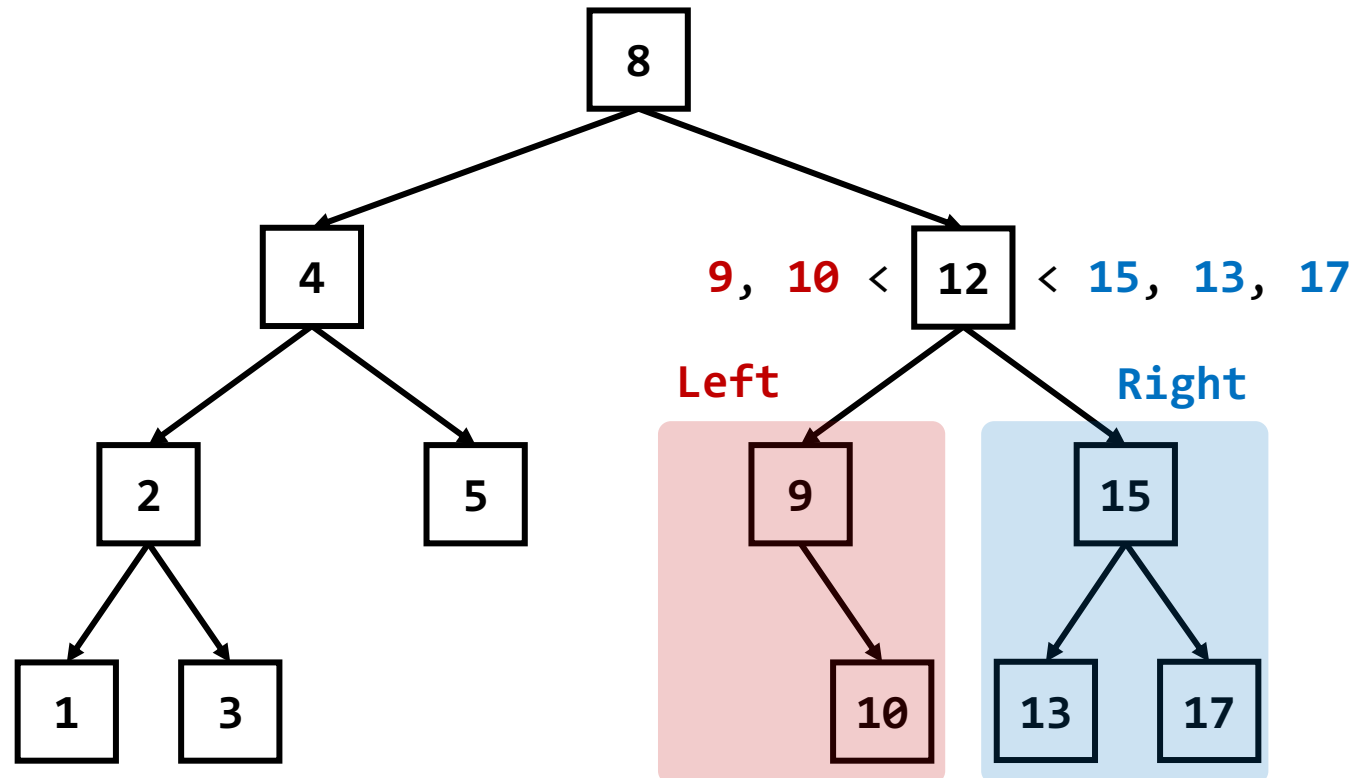
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 2. For any node **X**, all nodes in its **left subtree** are less than **X**
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Binary Search Trees (BSTs)



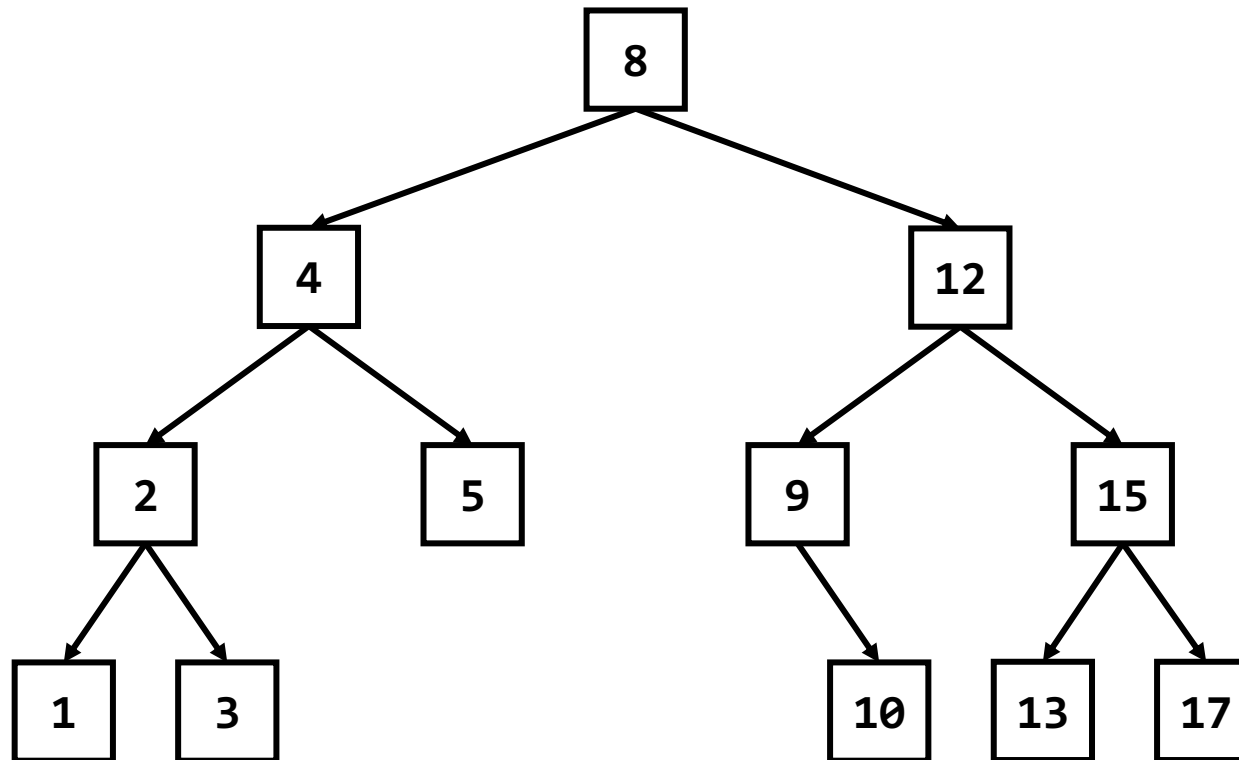
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BST Operations



- **Validity** - check whether a binary tree is a binary search tree?
- **Search** - find the node of the target **KEY**
- **Insertion/Deletion** - insert/delete the node using **KEY**



BST Operations



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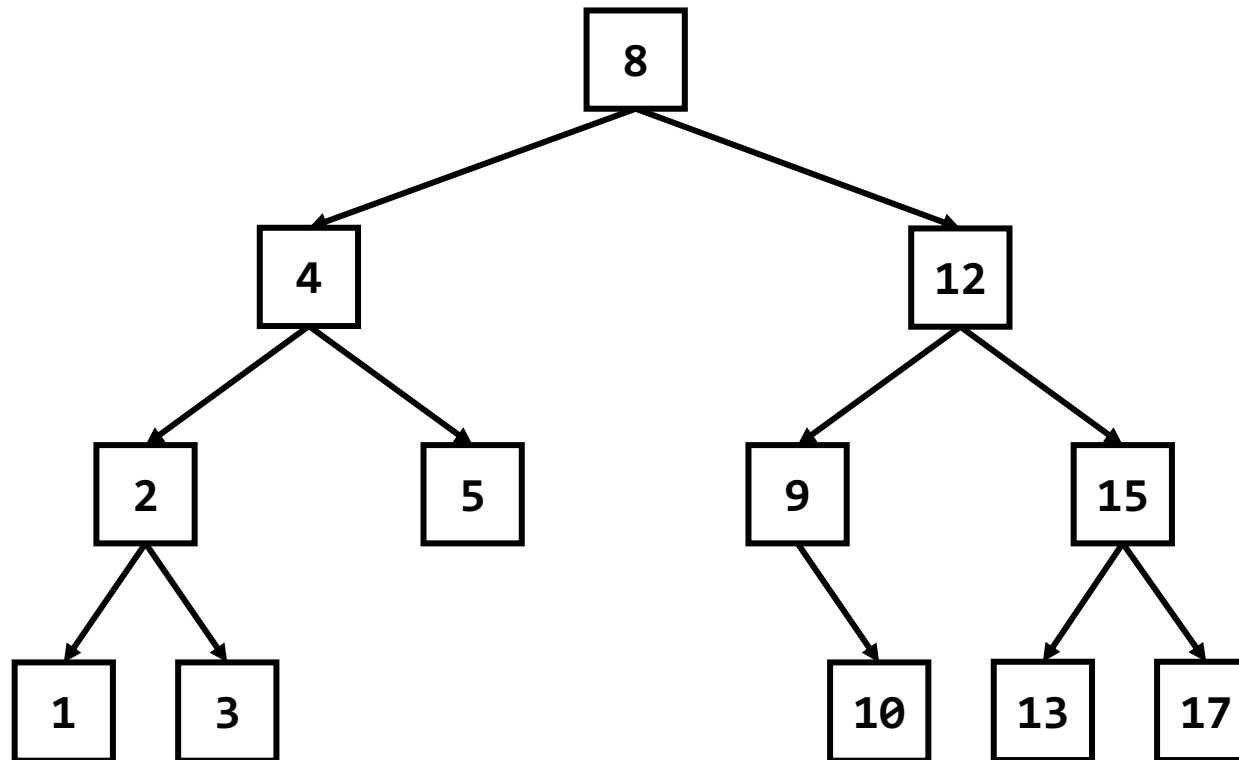
```
typedef struct _Node {  
    int key;  
    struct _Node *left, *right;  
} Node;
```

```
Node* createLeaf(int key); // Create a leaf node with key  
void removeTree(Node *tree); // Delete the node and its all descendants  
int computeHeight(Node *node); // Compute height of the subtree rooted at the node  
void traverse(Node *node); // In-order traversal  
bool isBST(Node *node, int min, int max); // Check the BST validity  
Node* search(int key, Node *root); // This returns the specific node of the key  
Node* insertNode(int key, Node *root); // This returns the root after insertion  
Node* deleteNode(int key, Node *root); // This returns the root after deletion
```

BST Operations - Validity



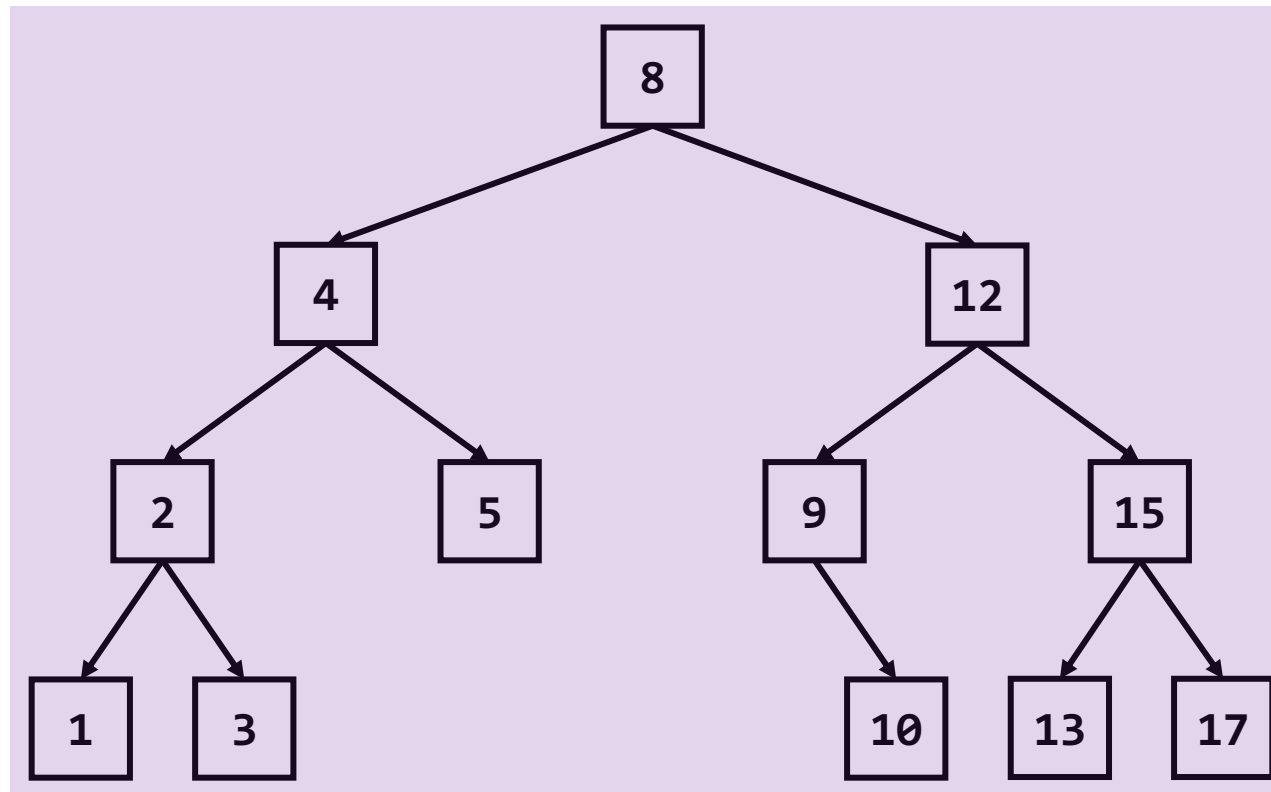
- How to check whether a binary tree is a binary search tree?
 - Let (a, b) is the interval between a (exclusive) and b (exclusive)
 - Formally, $(a, b) = \{x \in \mathbb{R} \mid a < x < b\}$
 - **(Q)** What is the set of possible keys for each subtree?



BST Operations - Validity



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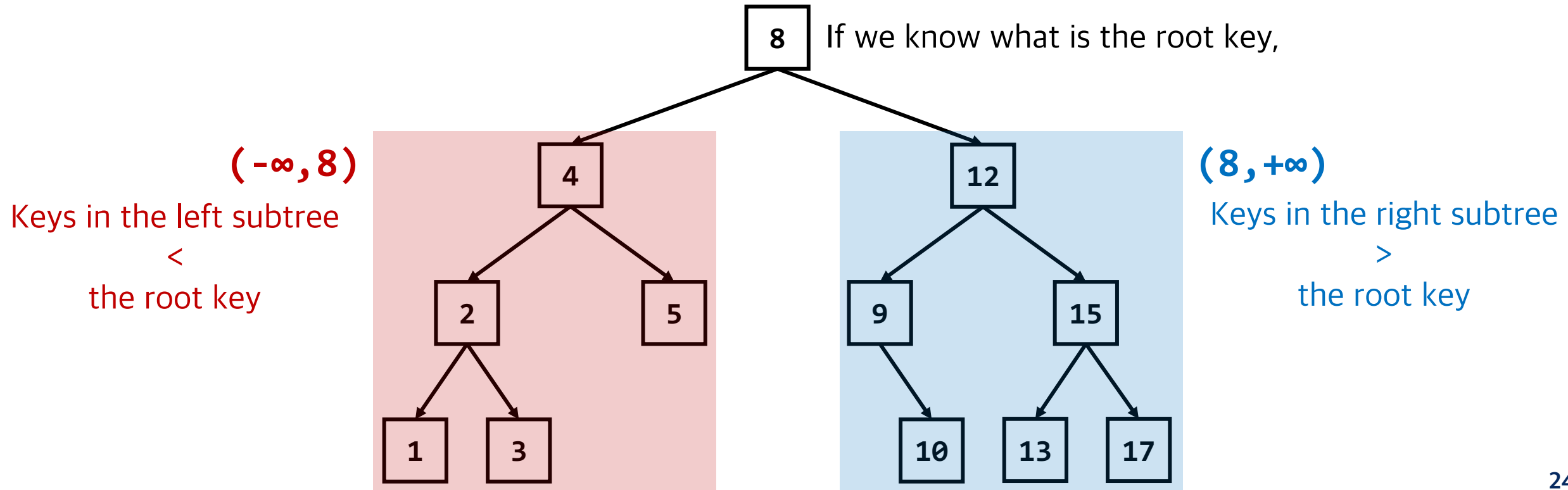
$(-\infty, +\infty)$

Any key can exist
in the entire tree

BST Operations - Validity



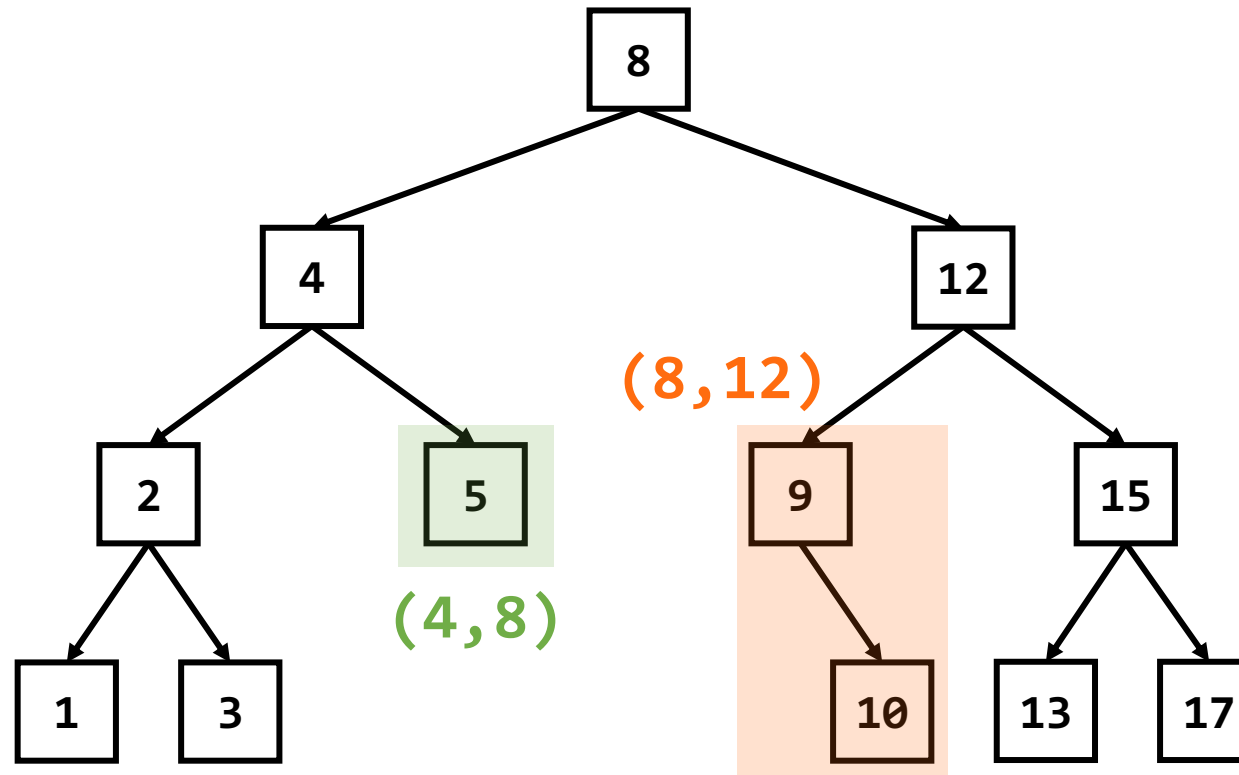
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BST Operations - Validity



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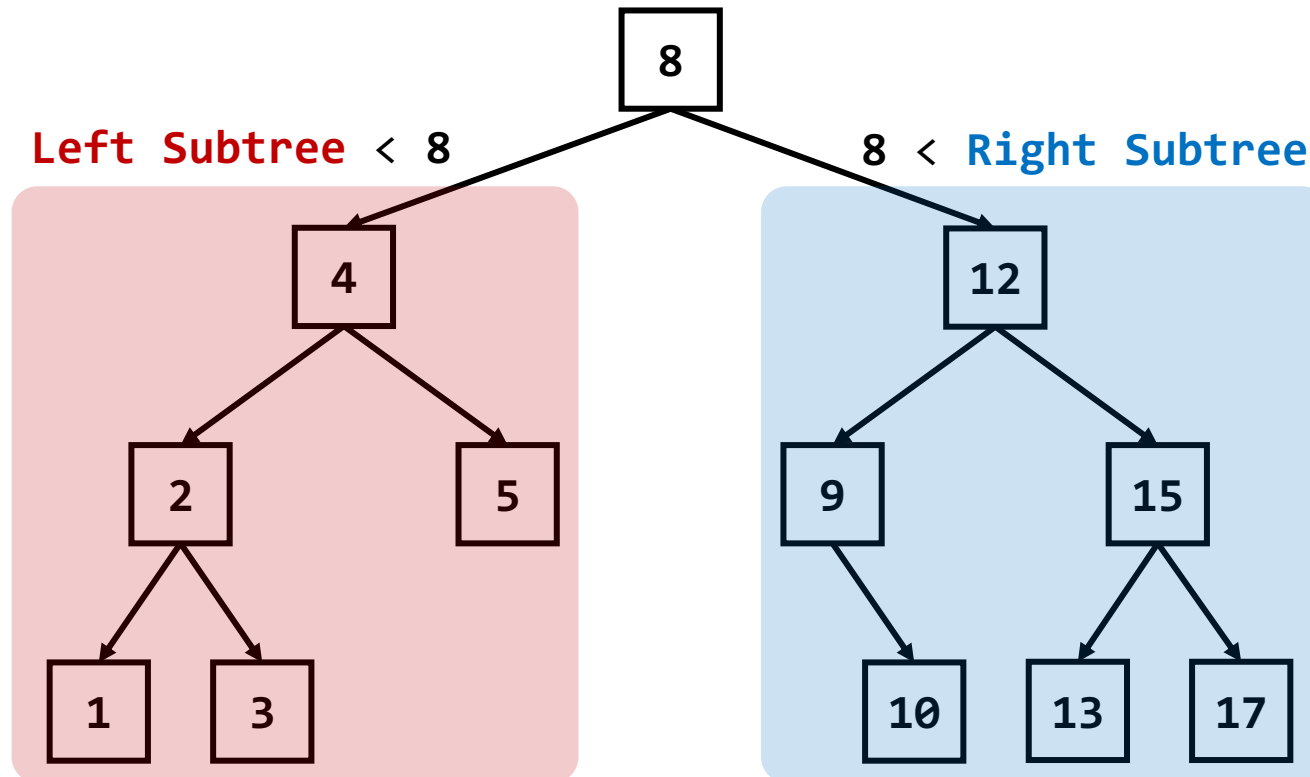
Algorithm: if (\min, \max) is the interval of possible keys of a tree,

1. Check whether its root key **K** is in the set
 2. Check whether all keys in its left subtree is in an interval (\min, \mathbf{K})
 3. Check whether all keys in its right subtree is in an interval (\mathbf{K}, \max)
 4. If 1 ~ 3 steps are passed, the tree satisfies $\min < \text{left} < \text{root} < \text{right} < \max$
- You can check whether a tree is a BST starting from the root with $(-\infty, +\infty)$

BST Operations - Search



- How to find the specific node that has the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**
 - **(Q)** Which subtree, left or right, does the node belong to?
 - Compare the target key with the root key

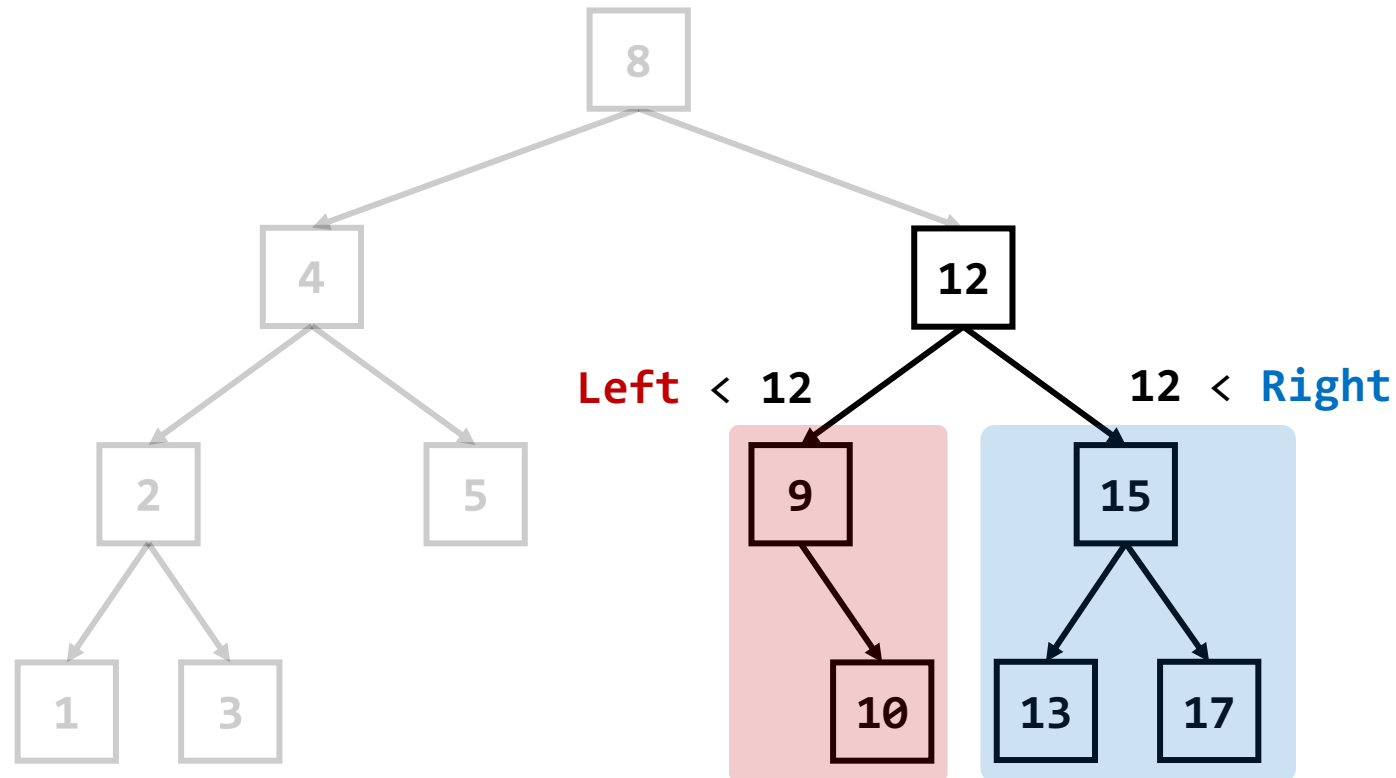


root=8 < key=13

BST Operations - Search



- How to find the specific node that has the target **key**?
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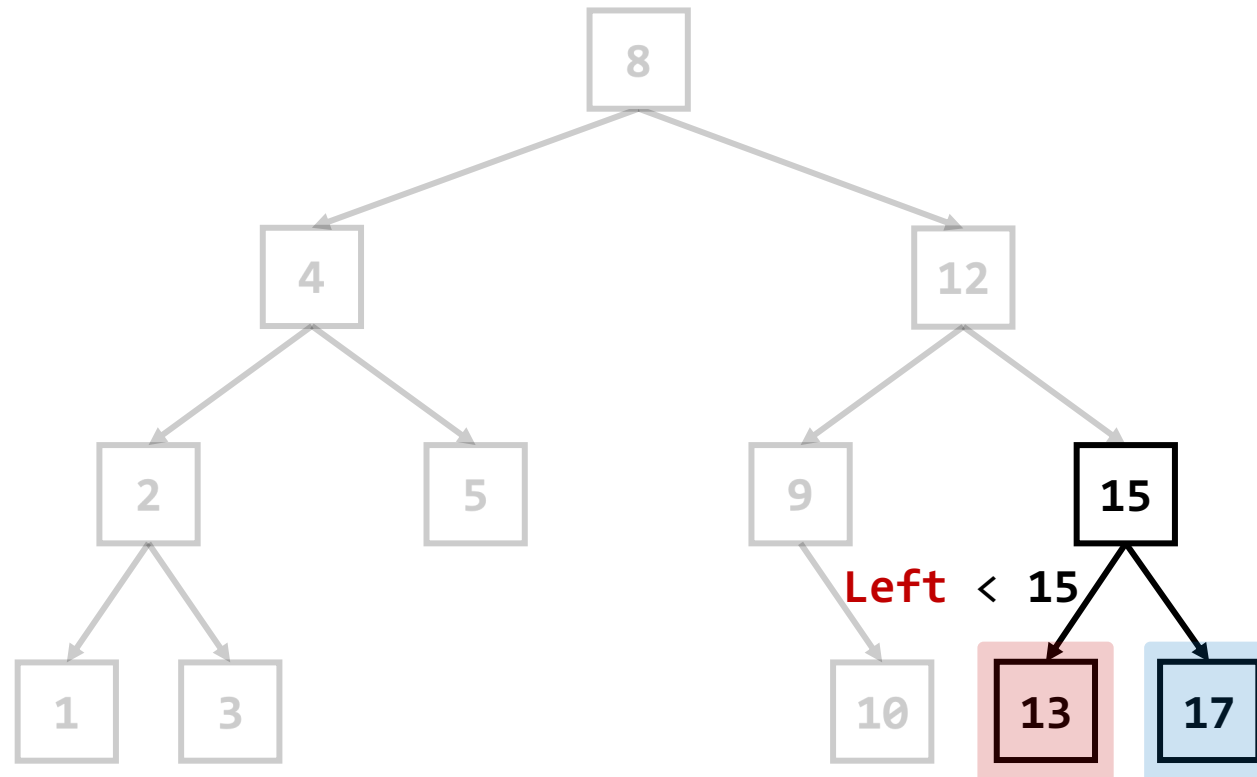


root=12 < key=13

BST Operations - Search



- How to find the specific node that has the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**
 - **(Q)** Which subtree, left or right, does the node belong to?
 - Compare the target key with the root key



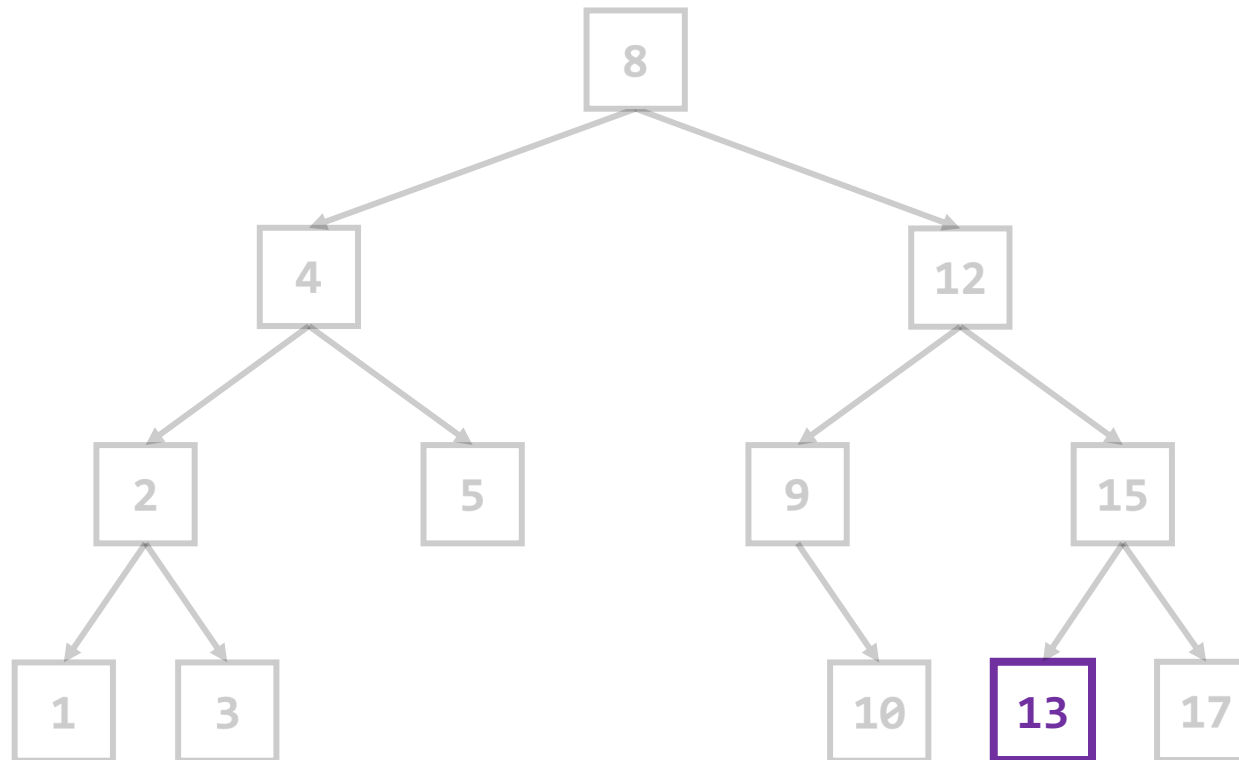
key=13 < **root=15**

15 < **Right**

BST Operations - Search



- How to find the specific node that has the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**
 - **(Q)** Which subtree, left or right, does the node belong to?
 - Compare the target key with the root key



key=13 = root=13

BST Operations - Search



- How to find the specific node that has the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**

Algorithm: Compare the **target key** with the **root key** recursively

1. If they are equal, the root node is what we find
 2. If **target key** < **root key**, find the node in the **left subtree**
 3. If **root key** < **target key**, find the node in the **right subtree**
- **(Q)** What is the time complexity of this search algorithm?

BST Operations - Search



- How to find the specific node that has the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**

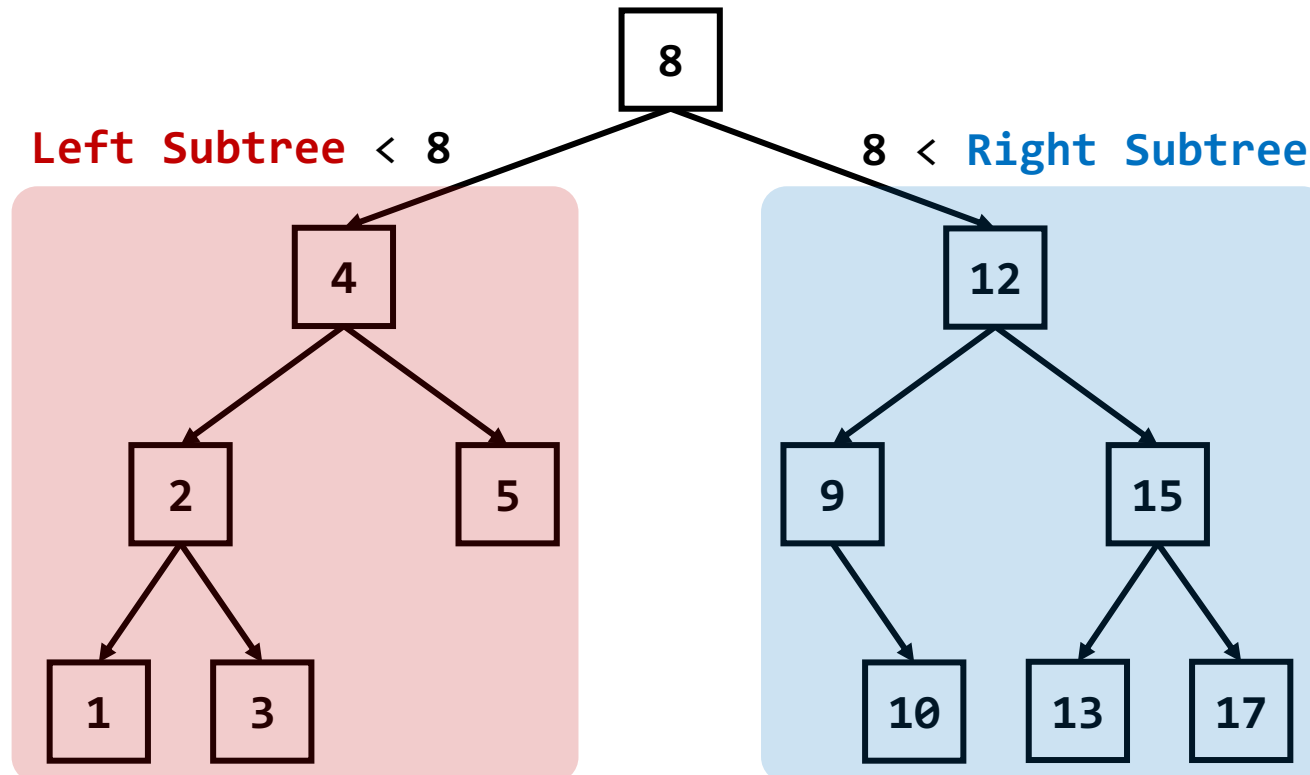
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 3. If **root key** < **target key**, find the node in the **right subtree**
- **(Q)** What is the time complexity of this search algorithm?
 - **(A)** The height of the binary search tree, i.e., $O(H)$

BST Operations - Insertion



- How to insert a new node with the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**
 - **(Q)** Which subtree, left or right, does the node belong to?
 - Compare the target key with the root key

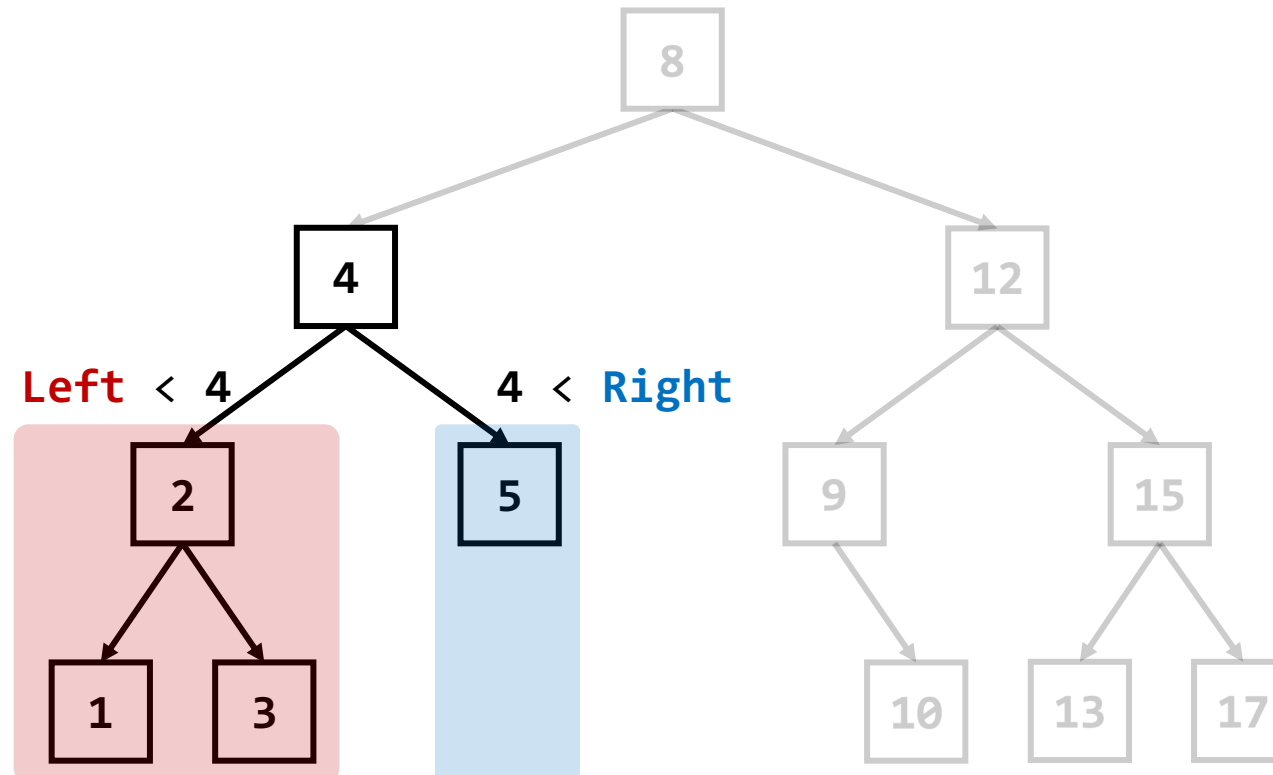


key=7 < **root=8**

BST Operations - Insertion



- How to insert a new node with the target **key**?
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 - **(Q)** Which subtree, left or right, does the node belong to?
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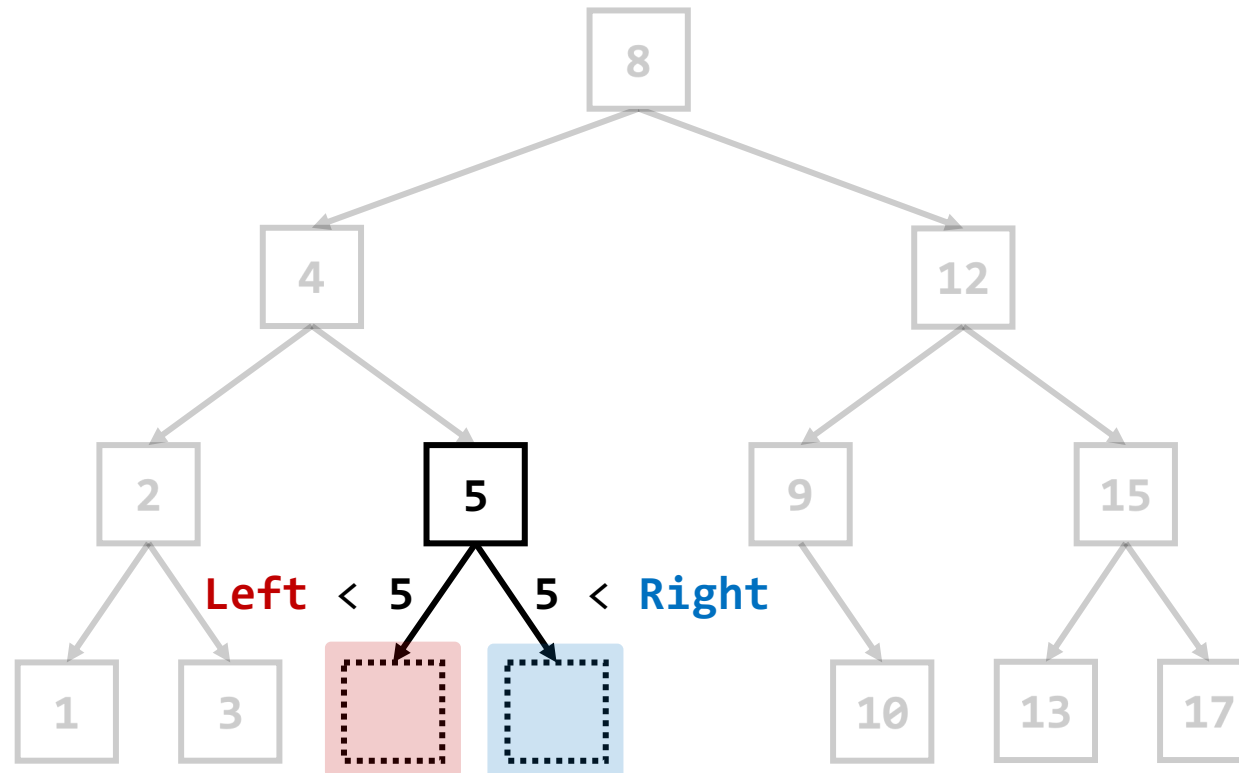


root=4 < key=7

BST Operations - Insertion



- How to insert a new node with the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**
 - **(Q)** Which subtree, left or right, does the node belong to?
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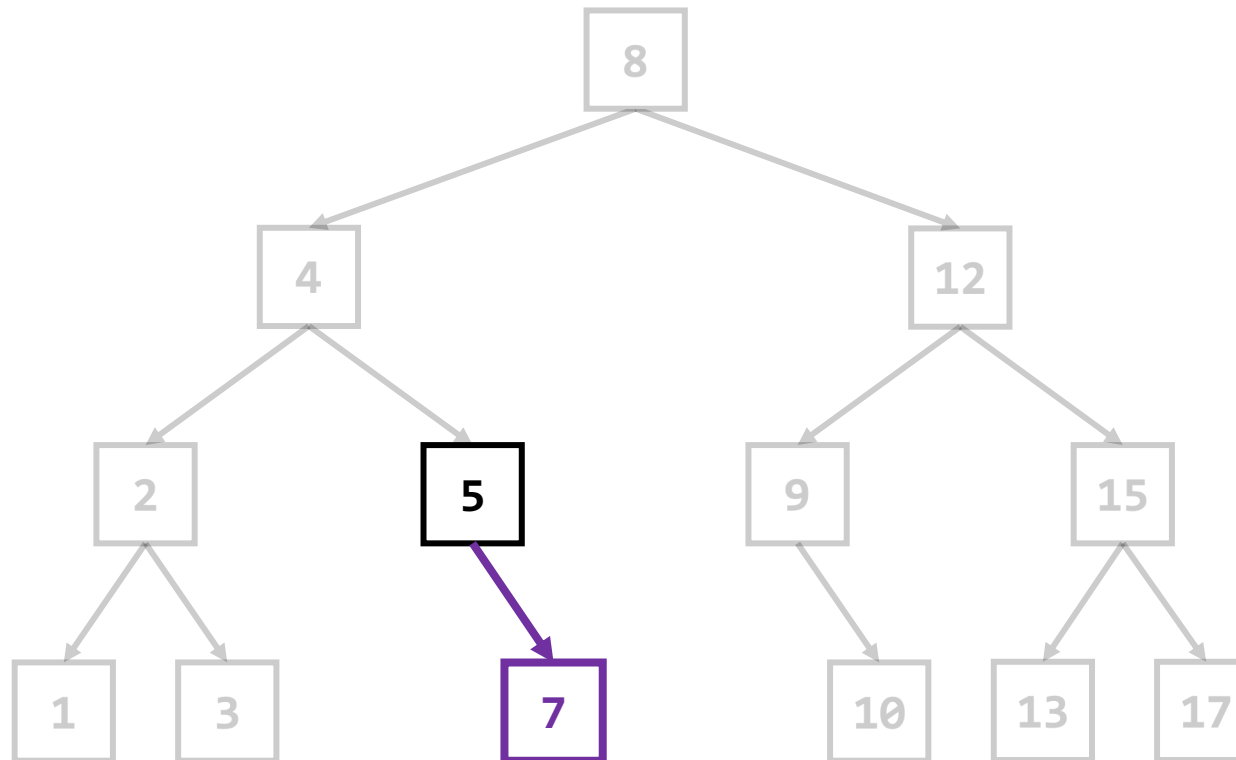


root=5 < **key=7**

BST Operations - Insertion



- How to insert a new node with the target **key**?
 - Use the BST condition: **left subtree** < **root** < **right subtree**
 - **(Q)** Which subtree, left or right, does the node belong to?
 - Compare the target key with the root key



BST Operations - Insertion



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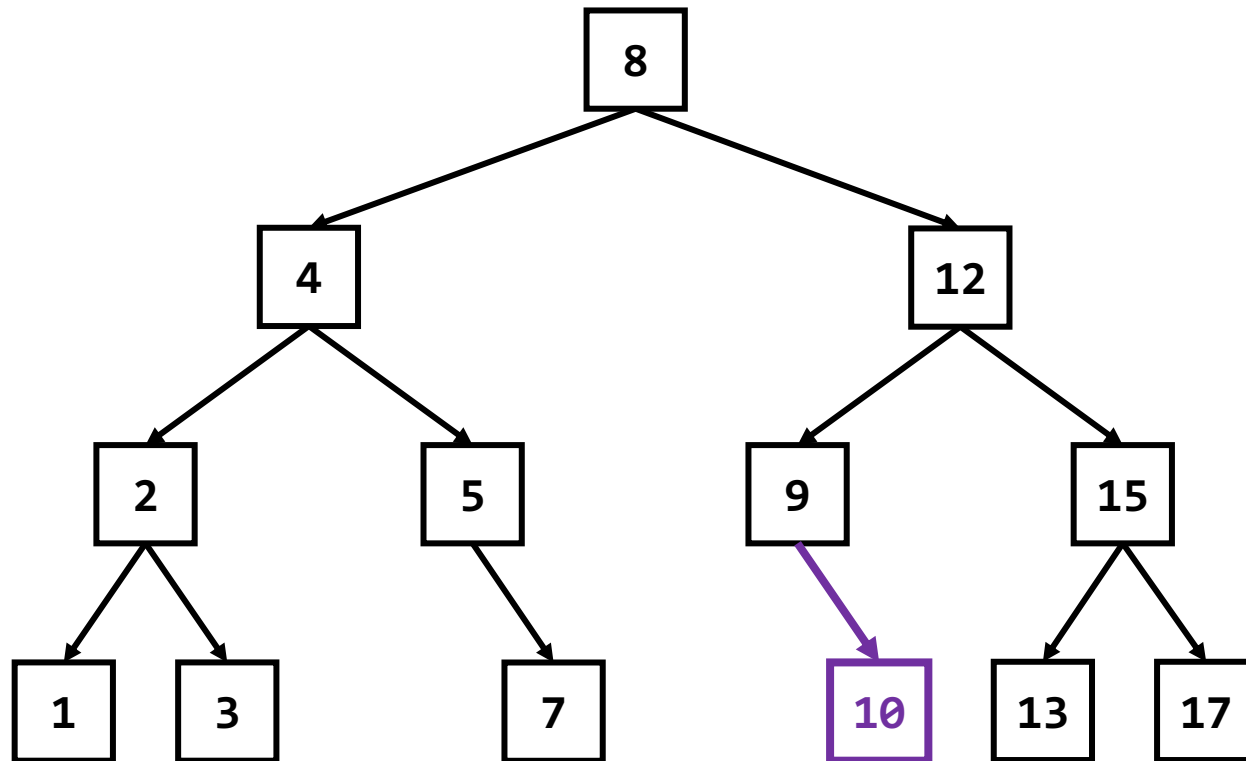
Algorithm: Compare the **target key** with the **root key** recursively

1. If **target key** < **root key**, find the insertion position in the **left subtree**
 - If the left subtree does not exist, insert the new node as the leaf child node
2. If **root key** < **target key**, find the insertion position in the **right subtree**
 - If the right subtree does not exist, insert the new node as the leaf child node

BST Operations - Deletion



- How to delete the node of the target **key** while satisfying BST conditions?
(Case 1) If the node has no child, it can be simply deleted

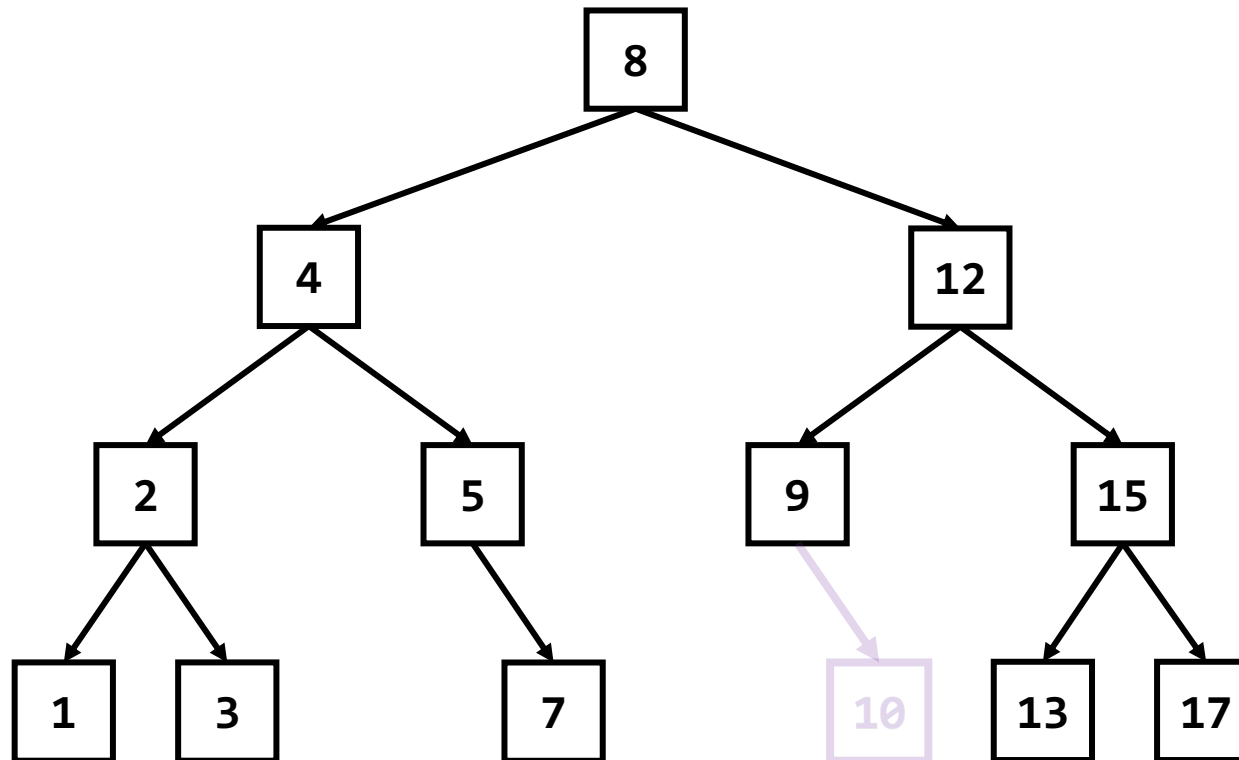


key = 10

BST Operations - Deletion



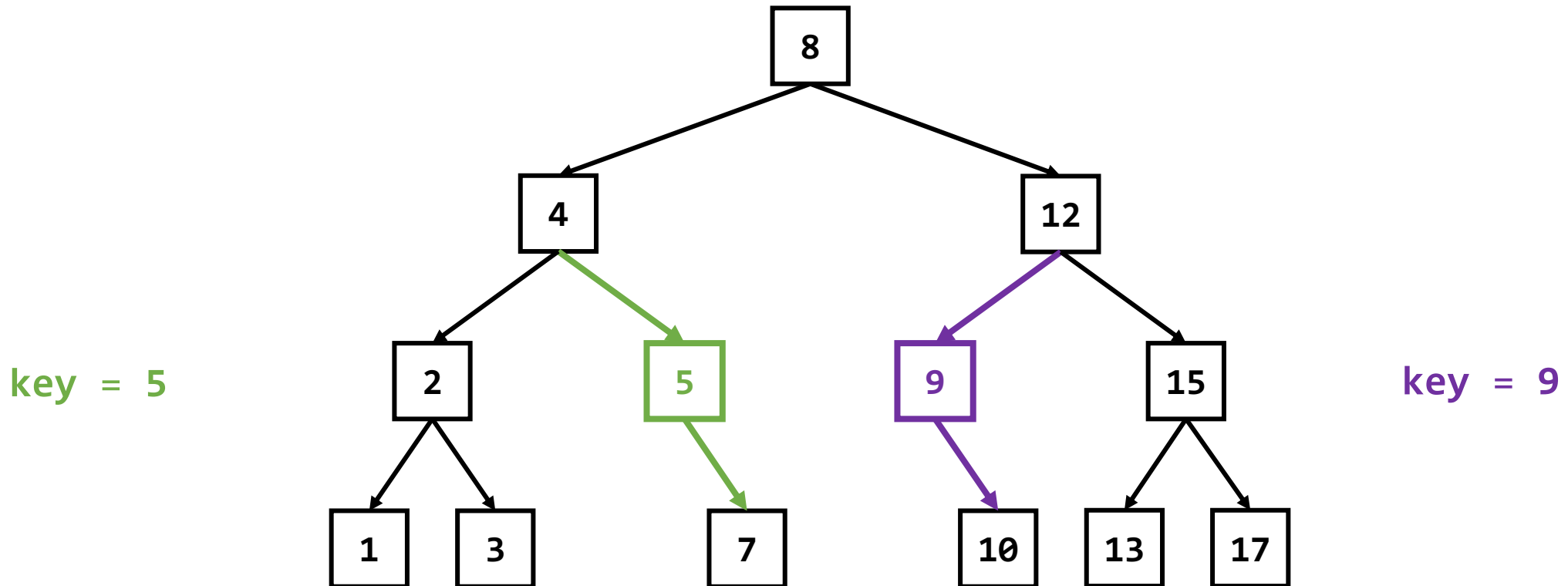
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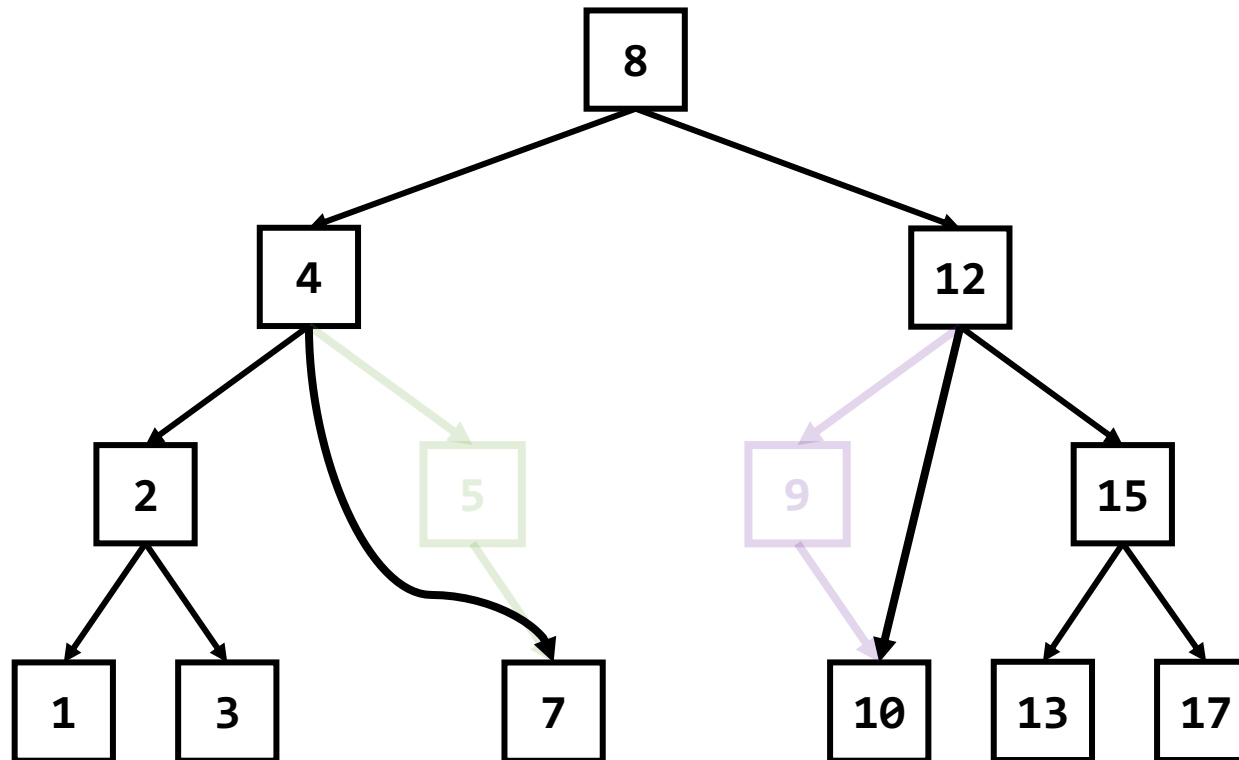
- How to delete the node of the target **key** while satisfying BST conditions?
(Case 2) If the node has one child, it can be deleted like the linked list structure



BST Operations - Deletion



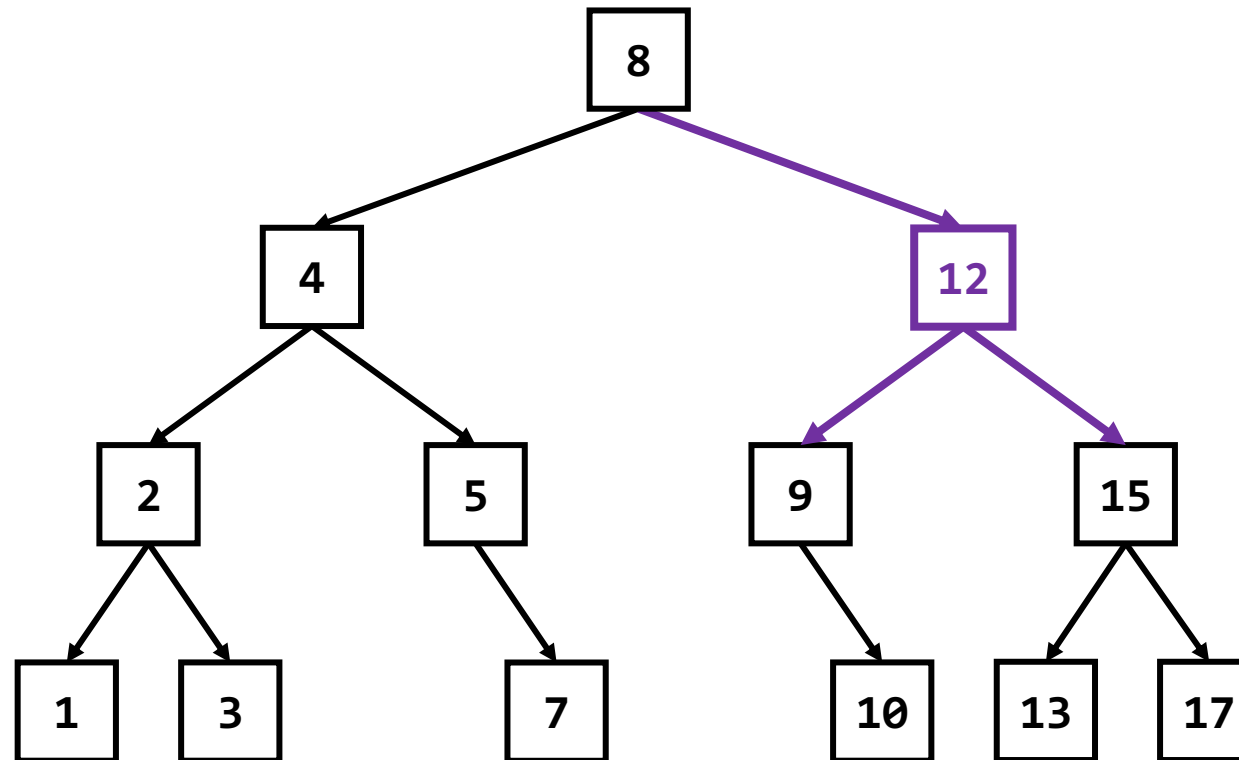
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BST Operations - Deletion



- How to delete the node of the target **key** while satisfying BST conditions?
(Case 3) If the node has two children, must find a replacement node

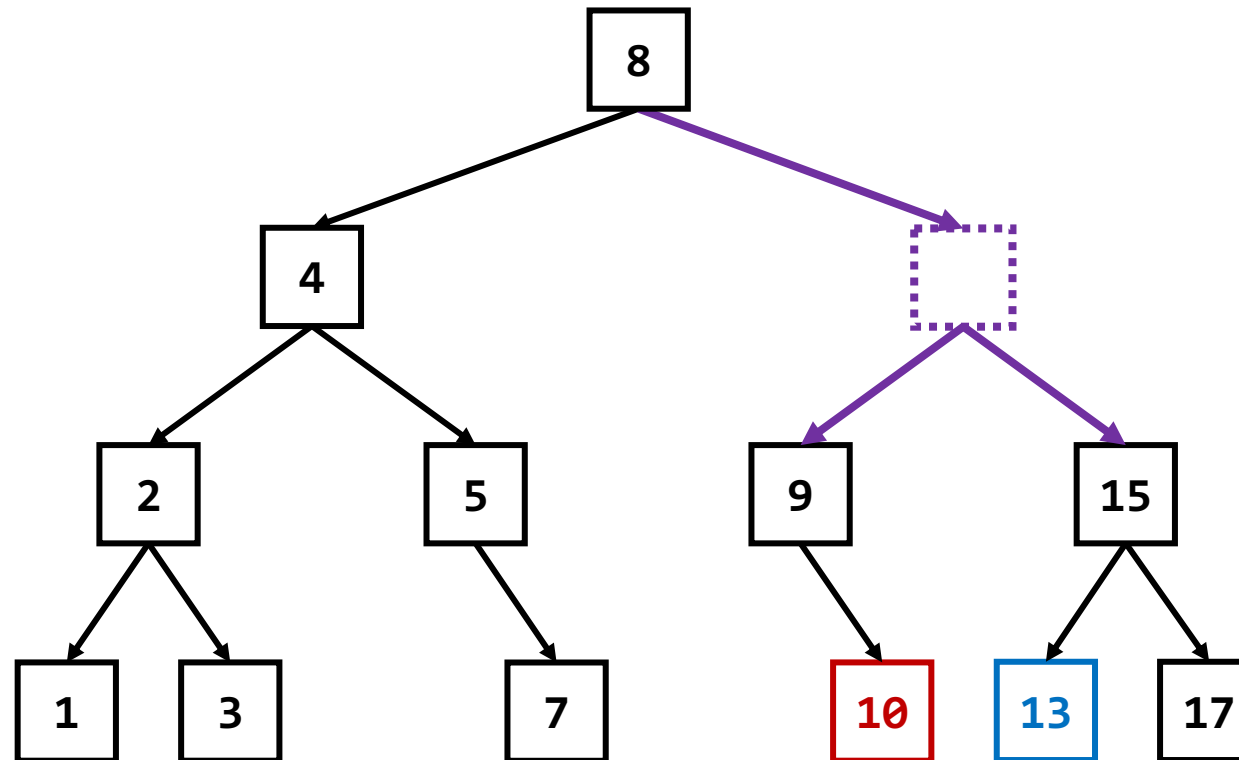


key = 12

BST Operations - Deletion



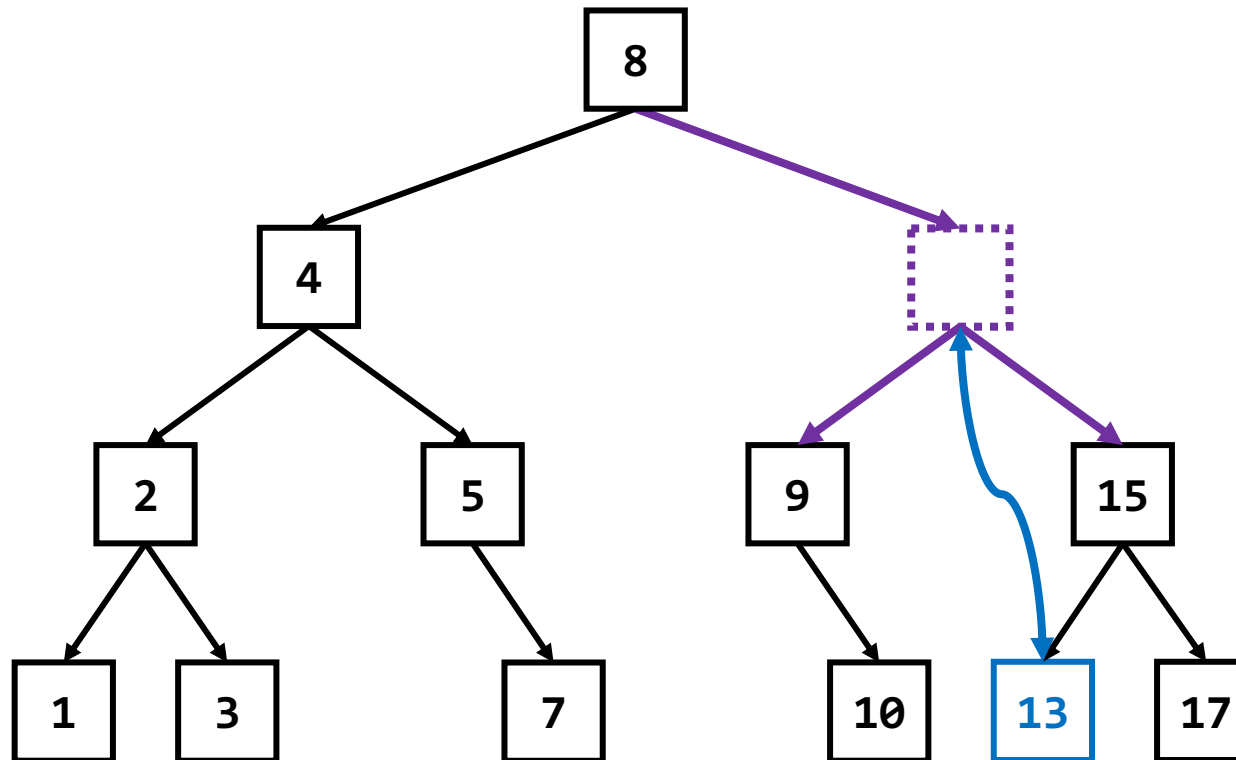
- How to delete the node of the target **key** while satisfying BST conditions?
(**Case 3**) If the node has two children, must find a replacement node
 - **In-order predecessor** : the largest (right-most) node in the left subtree
 - **In-order successor** : the smallest (left-most) node in the right subtree



BST Operations - Deletion



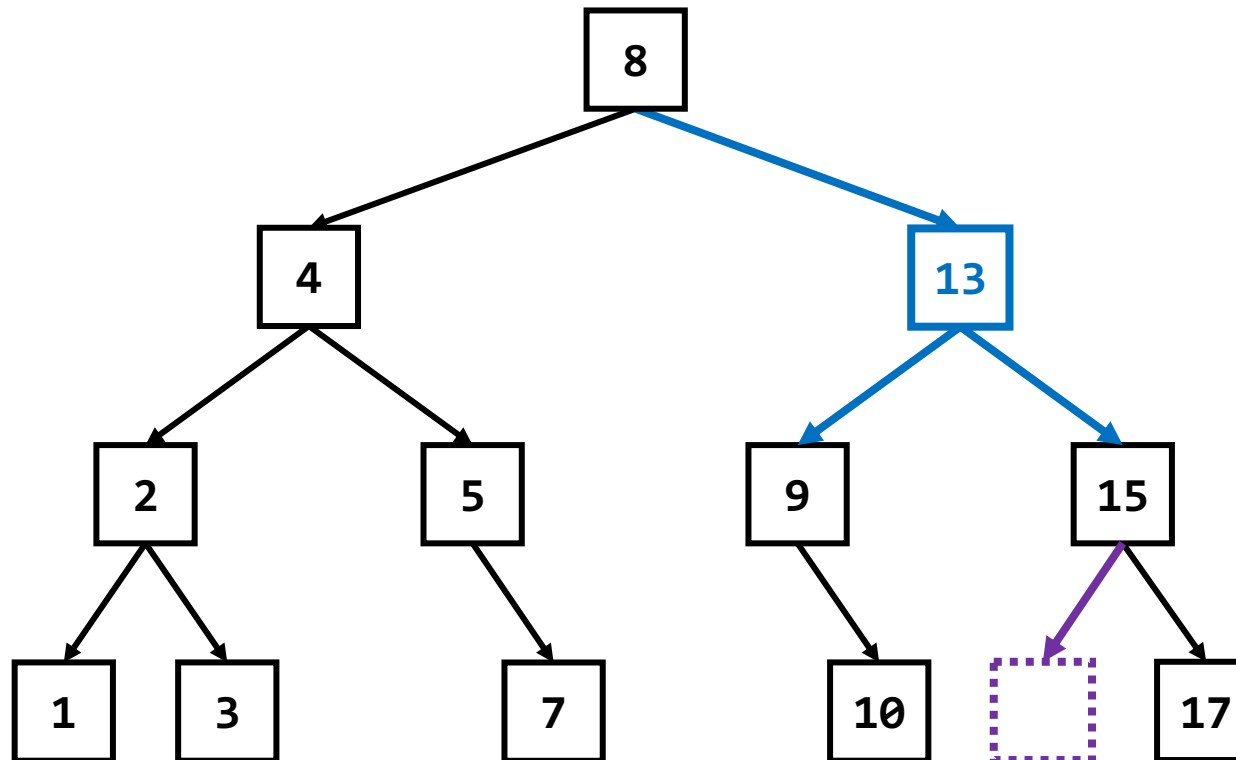
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BST Operations - Deletion



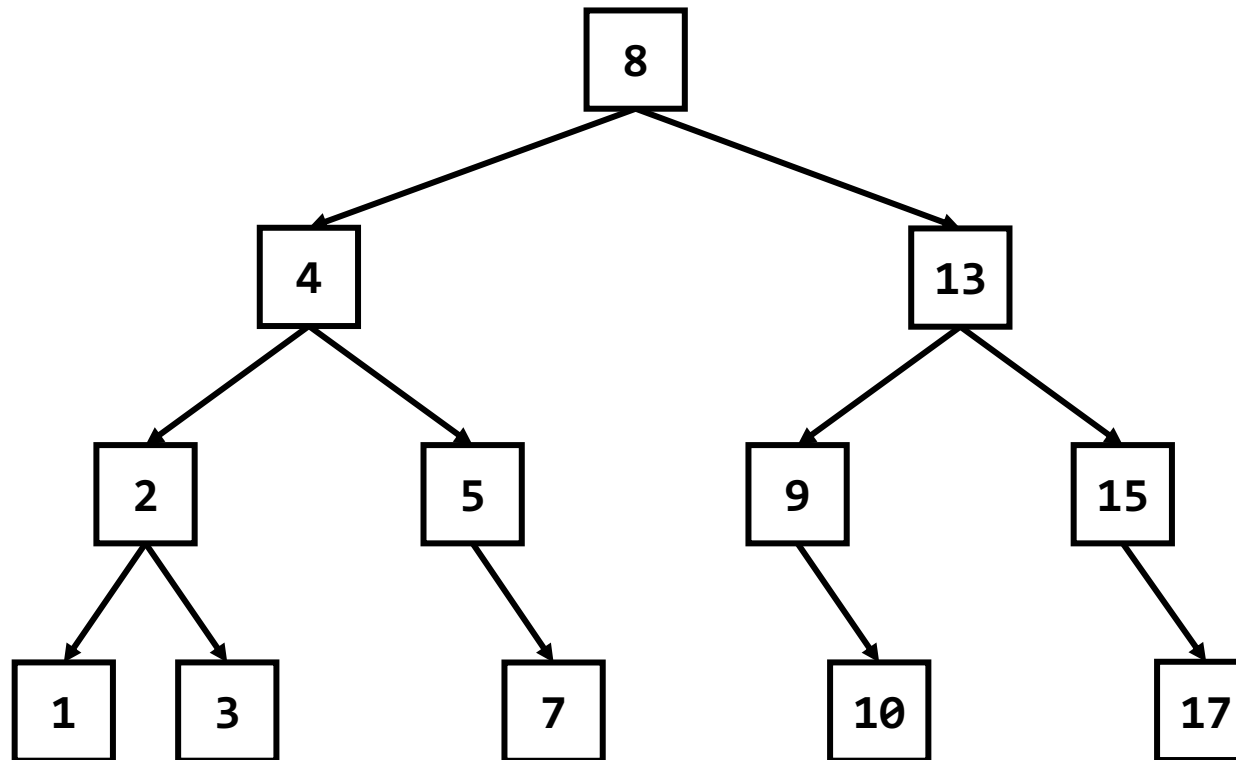
- How to delete the node of the target **key** while satisfying BST conditions?
(**Case 3**) If the node has two children, must find a replacement node
 - **In-order successor** : the smallest (left-most) node in the right subtree
 - After replacement, continue to delete **the node** at the original successor position



BST Operations - Deletion



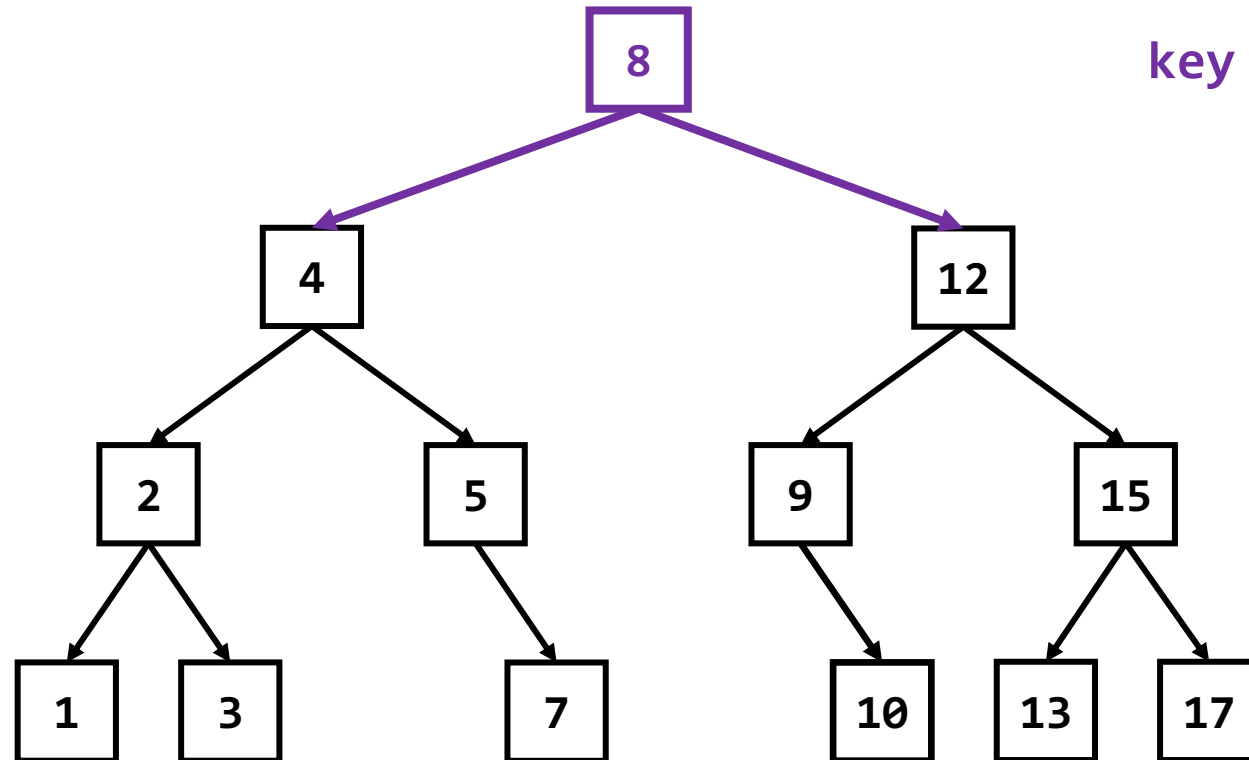
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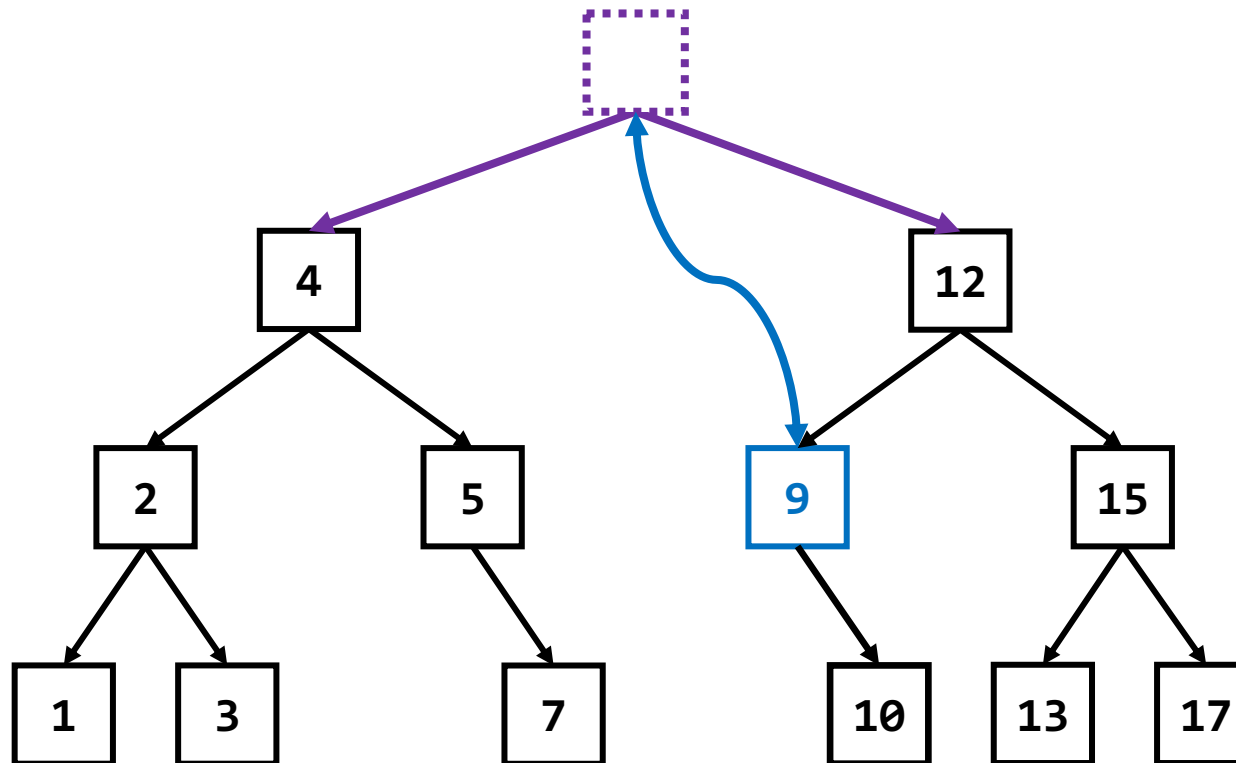
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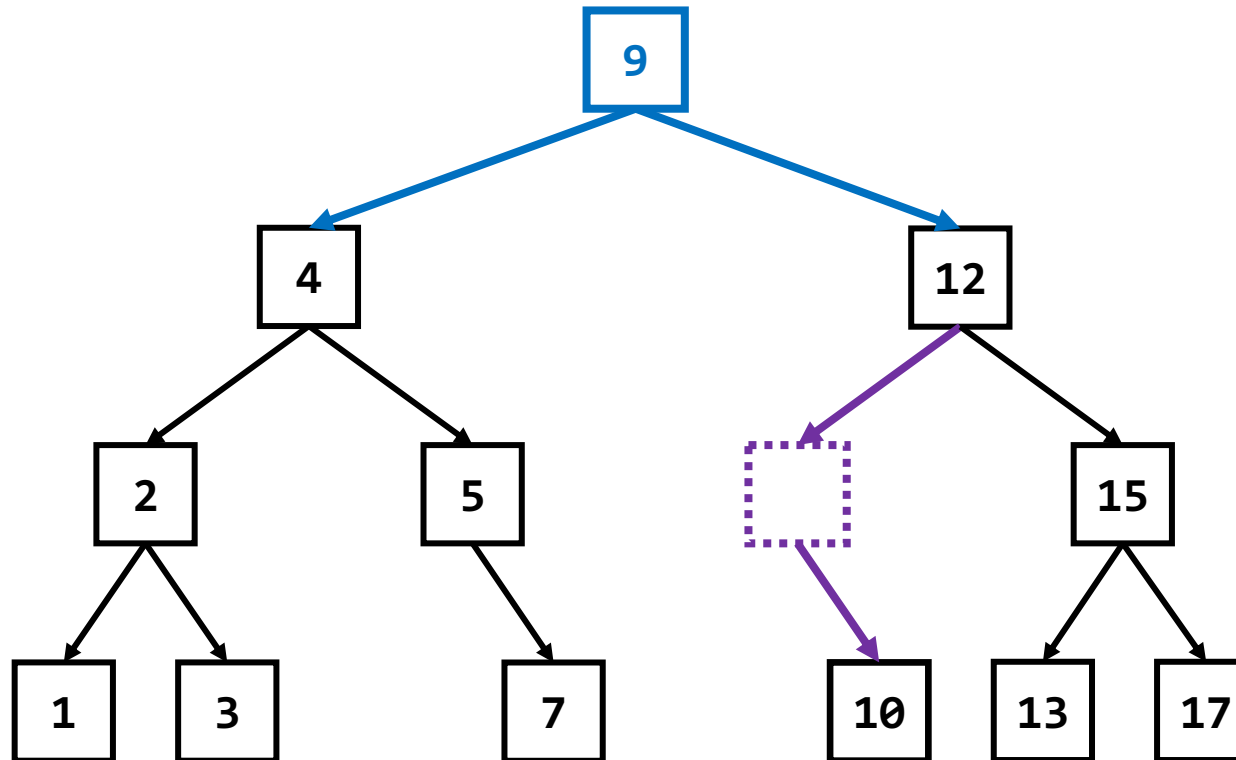
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 - **In-order successor** : the smallest (left-most) node in the right subtree
 - After replacement, continue to delete **the node** at the original successor position



BST Operations - Deletion



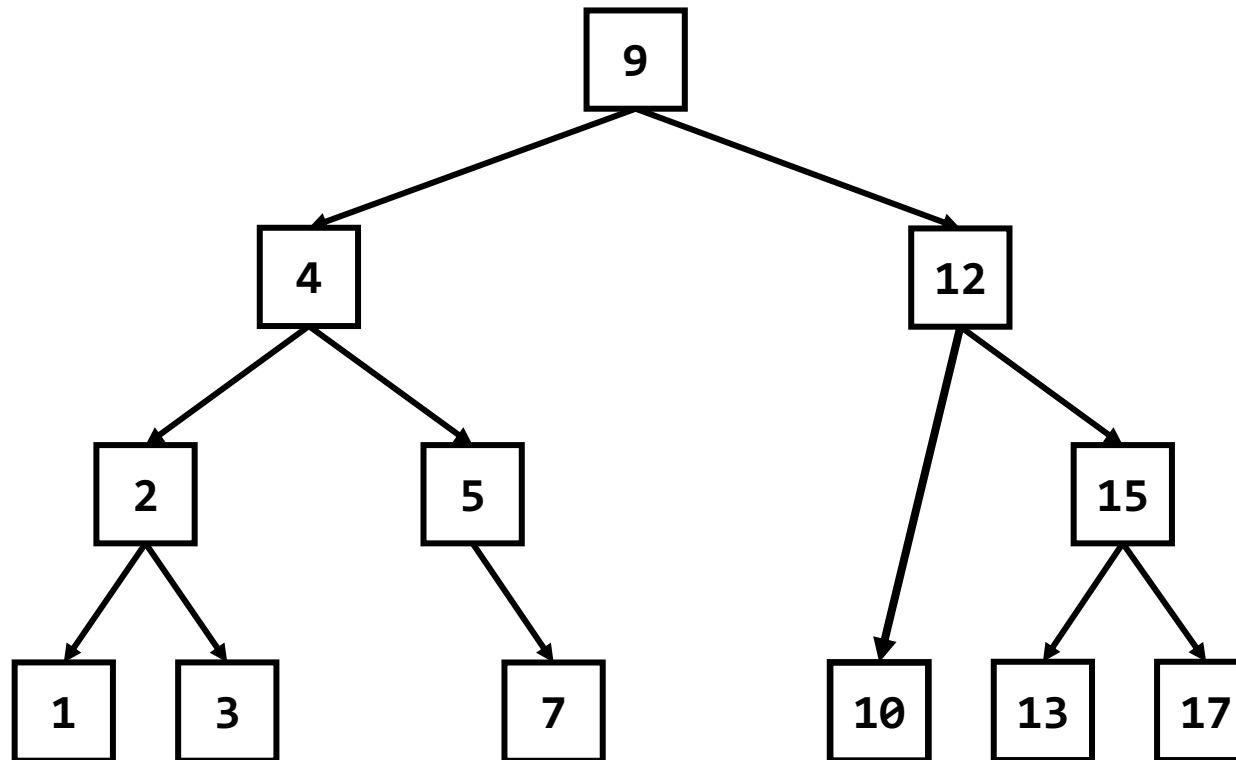
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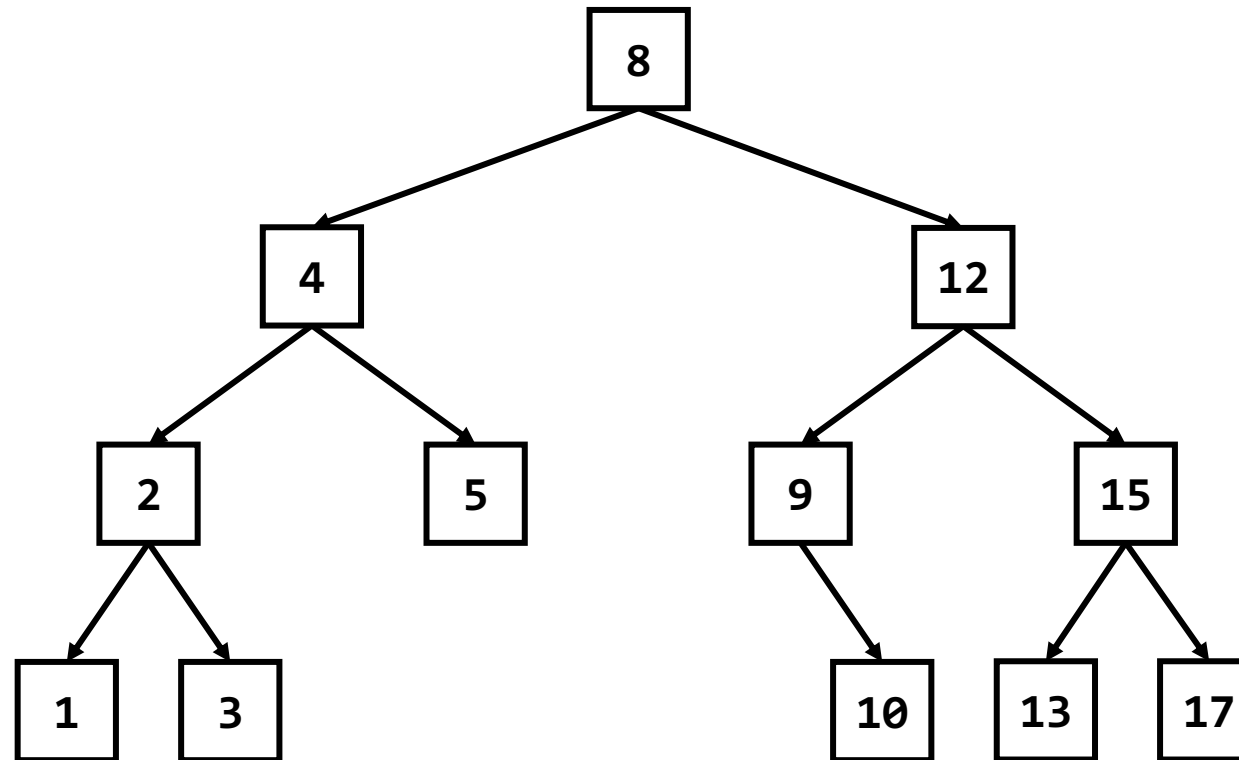


- How to delete the node of the target **key** while satisfying BST conditions?
 - (Case 1) If **the node** has no child, it can be simply deleted
 - (Case 2) If **the node** has one child, it can be deleted like the linked list structure
 - (Case 3) If **the node** has two children, must find a replacement node
 - **In-order successor** : the smallest (left-most) node in the right subtree
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BST Operations - Examples



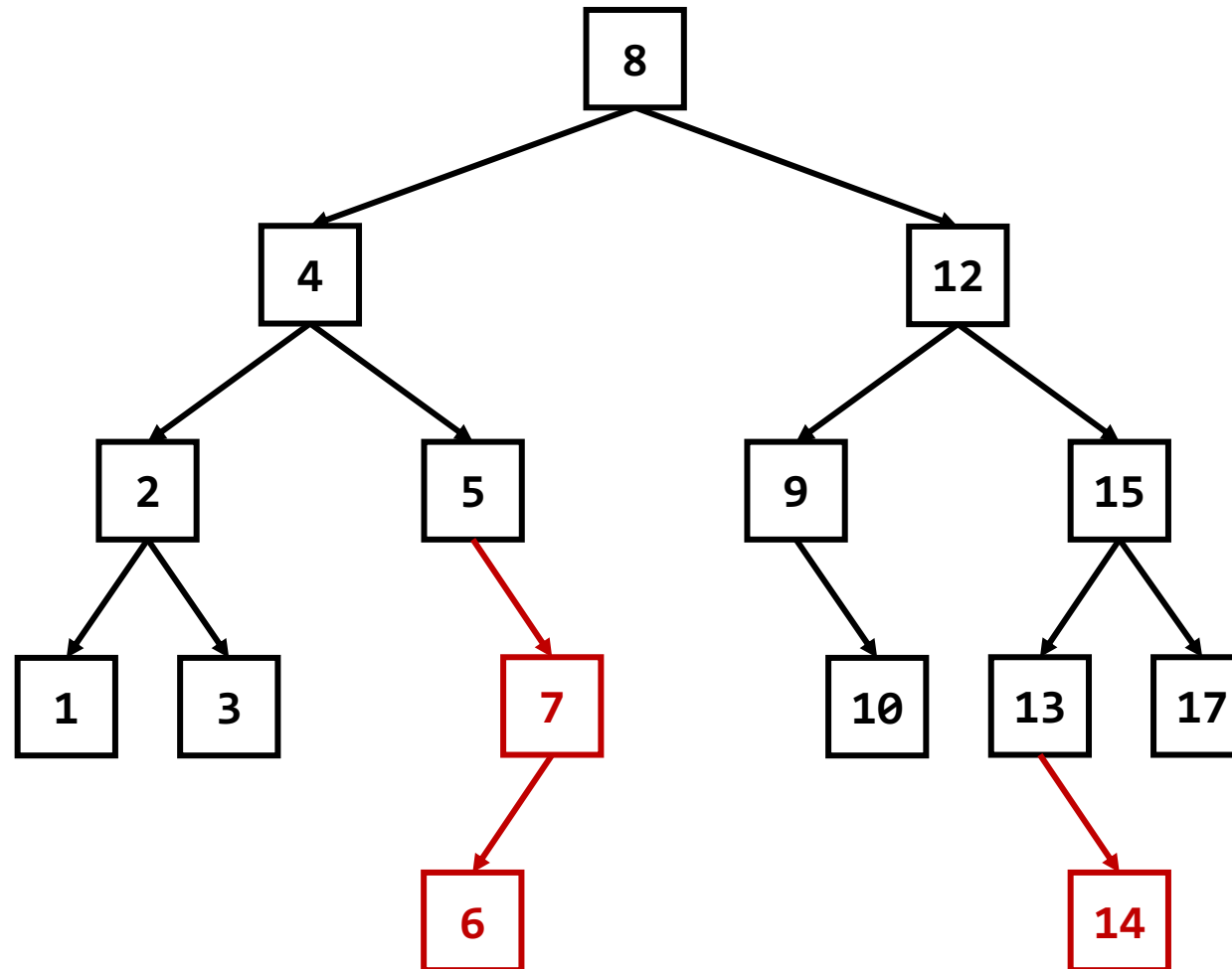
- What is the updated tree after inserting 7, 6, and 14 sequentially?



BST Operations - Examples



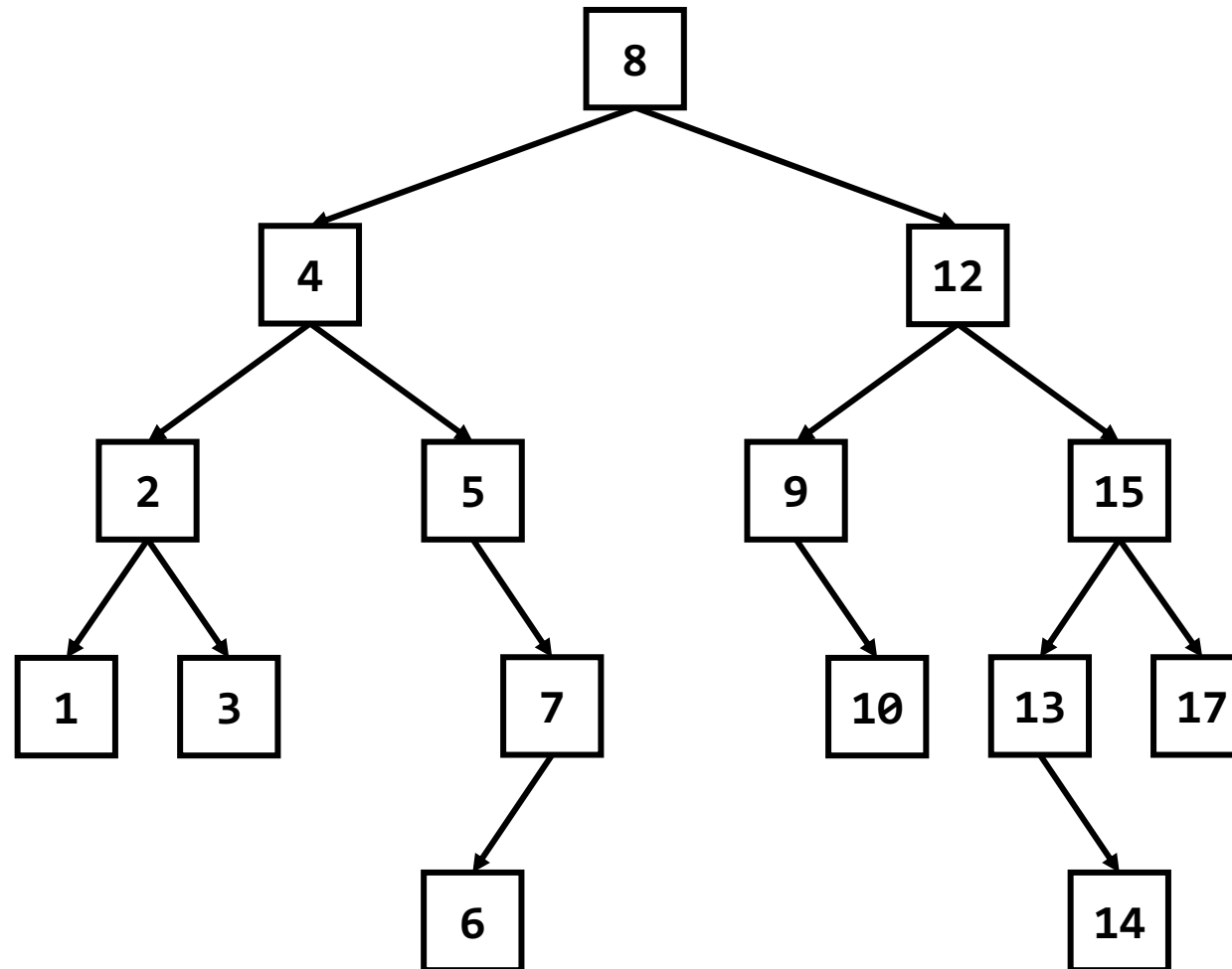
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BST Operations - Examples



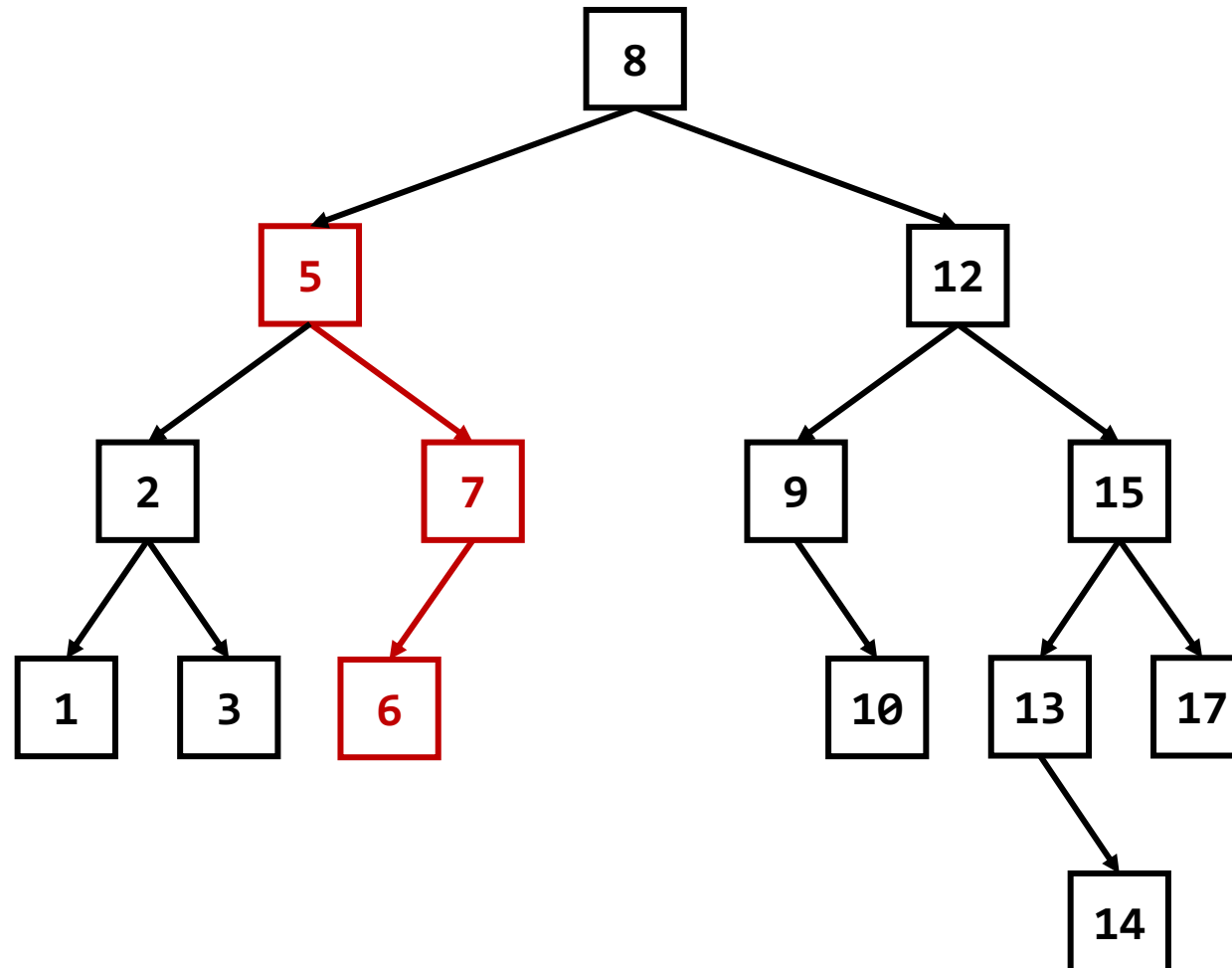
- What is the updated tree after deleting 4, and 12, and 9 sequentially?



BST Operations - Examples



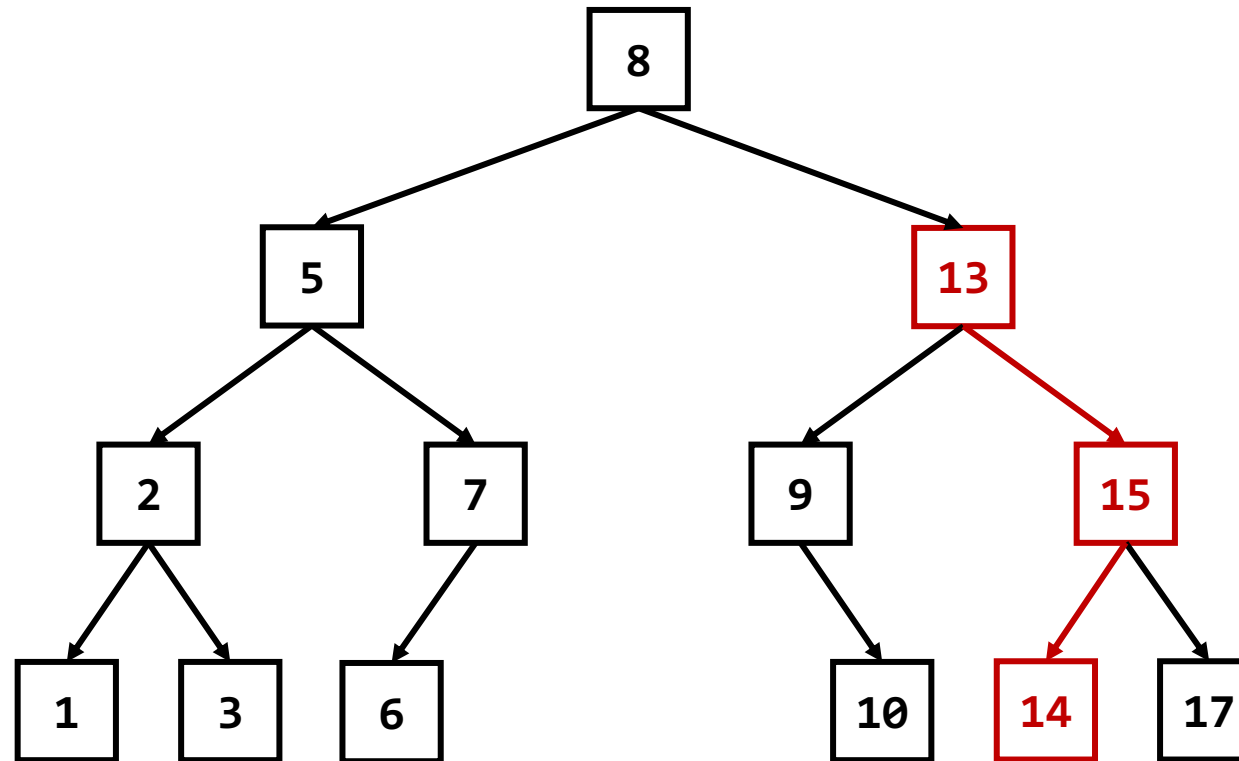
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BST Operations - Examples



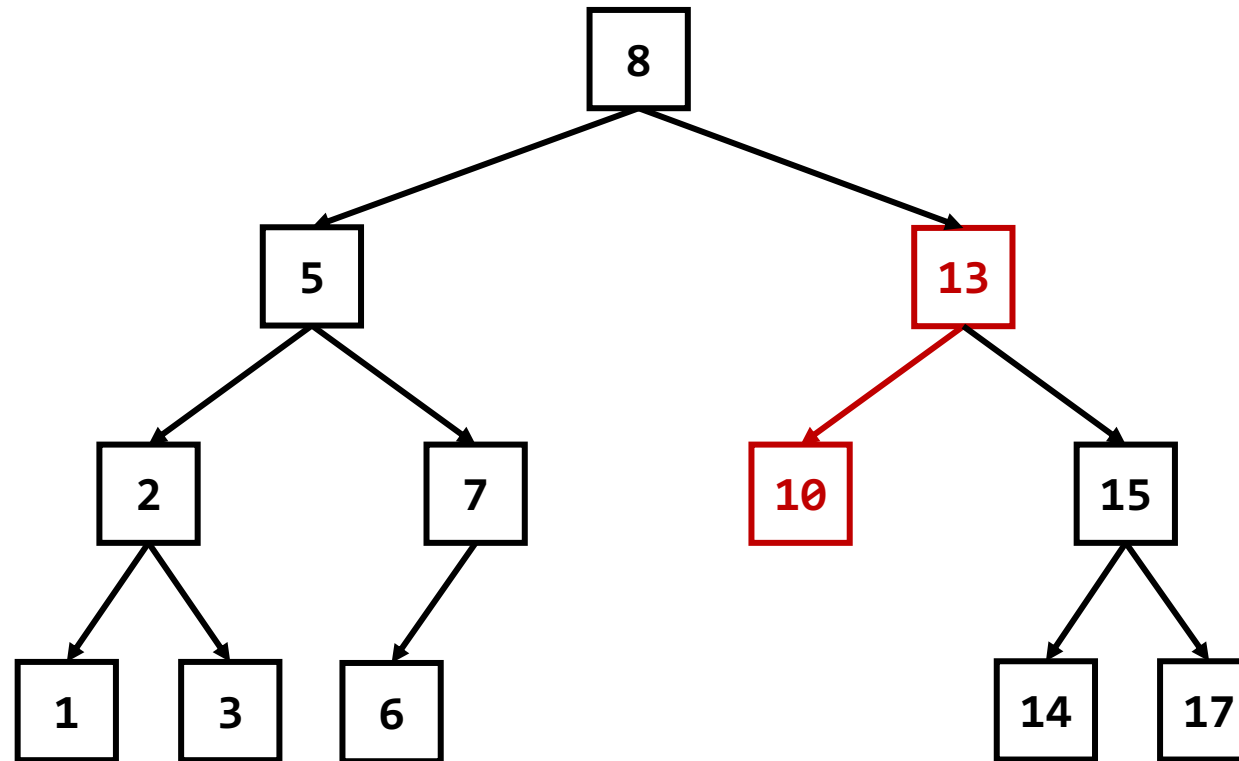
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BST Operations - Examples



- What is the updated tree after deleting 4, and 12, and 9 sequentially?



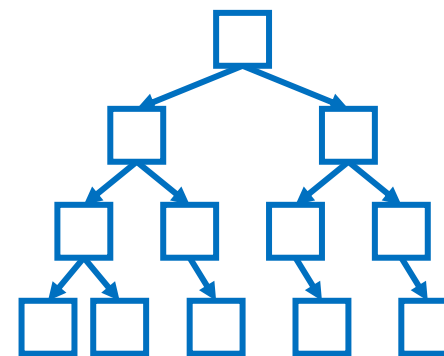
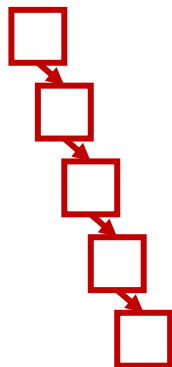
BST Operations - Time Complexity



- The time complexities for search, insertion, and deletion are $O(H)$
 - H is the tree height
 - $\log_2 N \leq H \leq N$ where N is the number of nodes in a binary tree

Operation	Balanced Tree	Skewed Tree
Search	$O(\log N)$	$O(N)$
Insertion	$O(\log N)$	$O(N)$
Deletion	$O(\log N)$	$O(N)$

- **Skewed Tree:** each internal node has only one child
- **Balanced Tree:** the left and the right subtrees have similar sizes



Any Questions?

