# Learning Goals

- Define a binary search tree
- Implement INSERTION and DELETION on a binary search tree
- Implement tree rotations
- Understand the meaning and consequence of balancedness of a BST

• A *tree* is a data structure that either is empty or consists a *root* node, with pointers linked to subtrees.

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- A tree is *binary* if every node of it has at most 2 children.
  - For a binary tree, a node's two children are referred to as its LEFT child and its RIGHT child.

# Illustration: A Binary Tree



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  - Some trees may not store satellite content in some of their nodes, e.g. a B+ tree. In this course we do not consider such trees.
- A binary tree is a *binary search tree* if for every node in it, its key value is larger than (or equal to) all those in its left subtree, and smaller than (or equal to) all those in its right subtree.



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- FIND(r, i) takes O(h(r)) time.

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  - In the worst case, the tree can be a linked list, so this is linear time.
  - In the best case, a tree with *n* nodes has height  $O(\log n)$ .
    - A tree with height *h* can have  $2^h 1$  nodes.
  - We'll study algorithms that maintain search trees in good shape.

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- The recursive algorithm is called an *inorder tree walk*: it outputs the root in between the left and the right subtrees.
- Pseudocode:

```
INORDER-TREE-WALK(r);

if x \neq NIL then

INORDER-TREE-WALK(left(r));

print key(x);

INORDER-TREE-WALK(right(r))

end
```

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- MAX(*r*): Given the root *r* of a BST, return the node with the largest key value in the tree
- Both operations take O(h(r)) time.

#### Successor and Predecessor

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```
SUCCESSOR(x);

if right(x) \neq NiL then return Min(right(x));

while parent(x) \neq NiL do

y \leftarrow parent(x);

if x = left(y) then return y;

x \leftarrow y;

end

return Nil
```

• PREDESSOR(x): Symmetric to SUCCESSOR.

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# **Illustration: Successor**



Case 1.

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# **Illustration: Successor**



Case 1.

Case 2.

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- Note that every newly inserted node becomes a leaf.

# Illustration: Insertion



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  - We can replace *x* by *y*, and delete *y*.

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# **Illustration: Deletion**



Case 1.

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- BST is more secure against malicious attacks.
  - If an adversary figures out the hash function we use, they can generate data that causes many collisions and slow down the performance.

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  - Traversal example: return all entries in increasing key values. Very natural with BST, but inefficient with hashing.