

# Trees and Tree-Based Algorithms

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# Objectives

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- Introduction to Trees
- Binary Trees
- Binary Tree Traversals
- Binary Search Trees
- AVL Trees
- Heaps

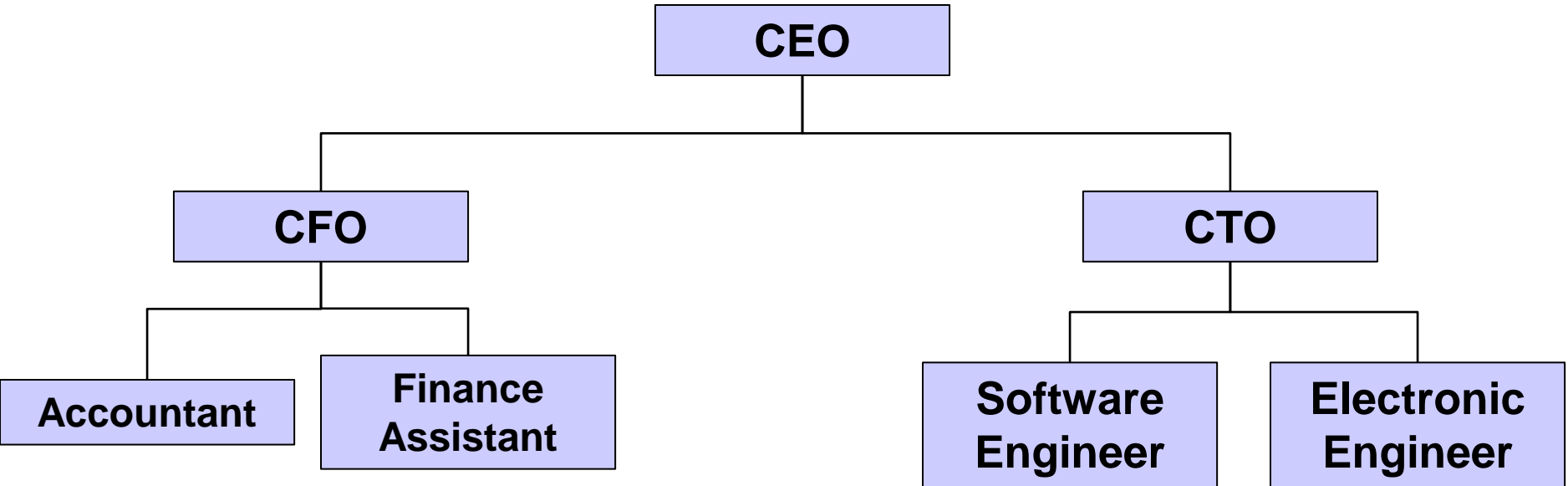
# Up Till Now...

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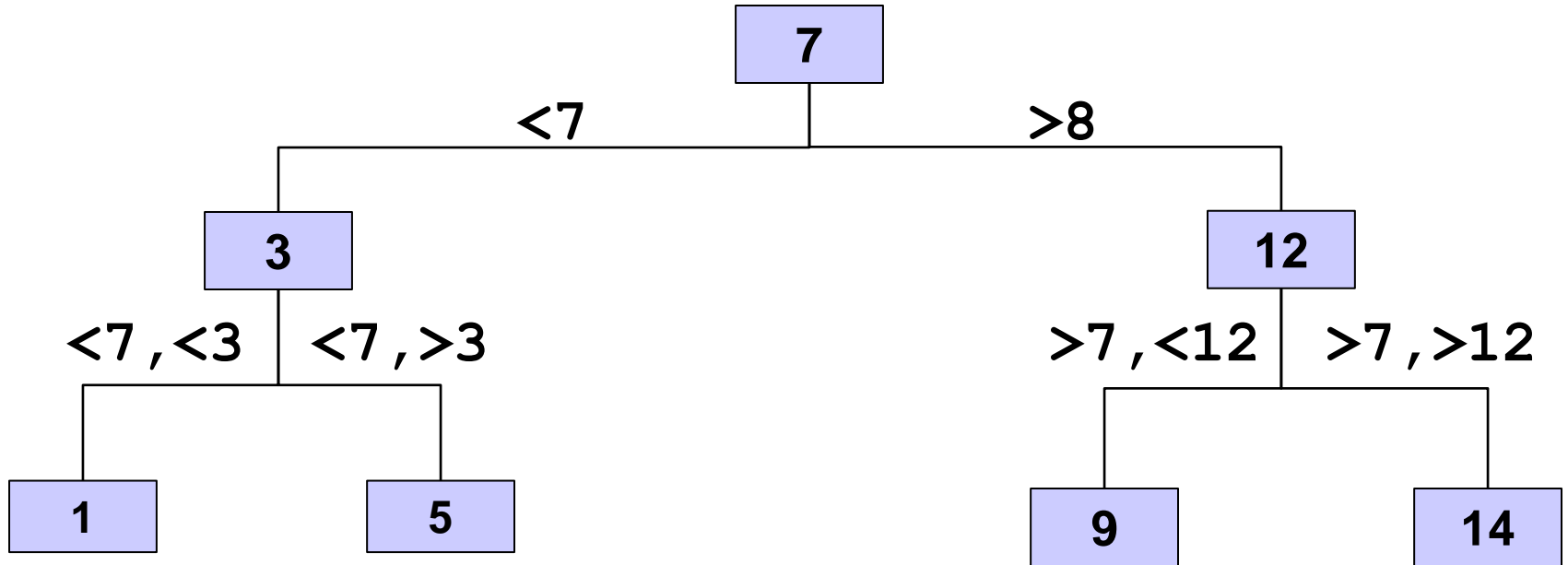
- Linear data structures
  - List, Queue, Stack
- Time to explore non-linear data structures
  - Powerful for real-life algorithms (searching, sorting, etc.)
  - Graphical depiction/optimization
- Trees: hierarchical

# Hierarchical Data Structure Example

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# Hierarchical Data Structure Example



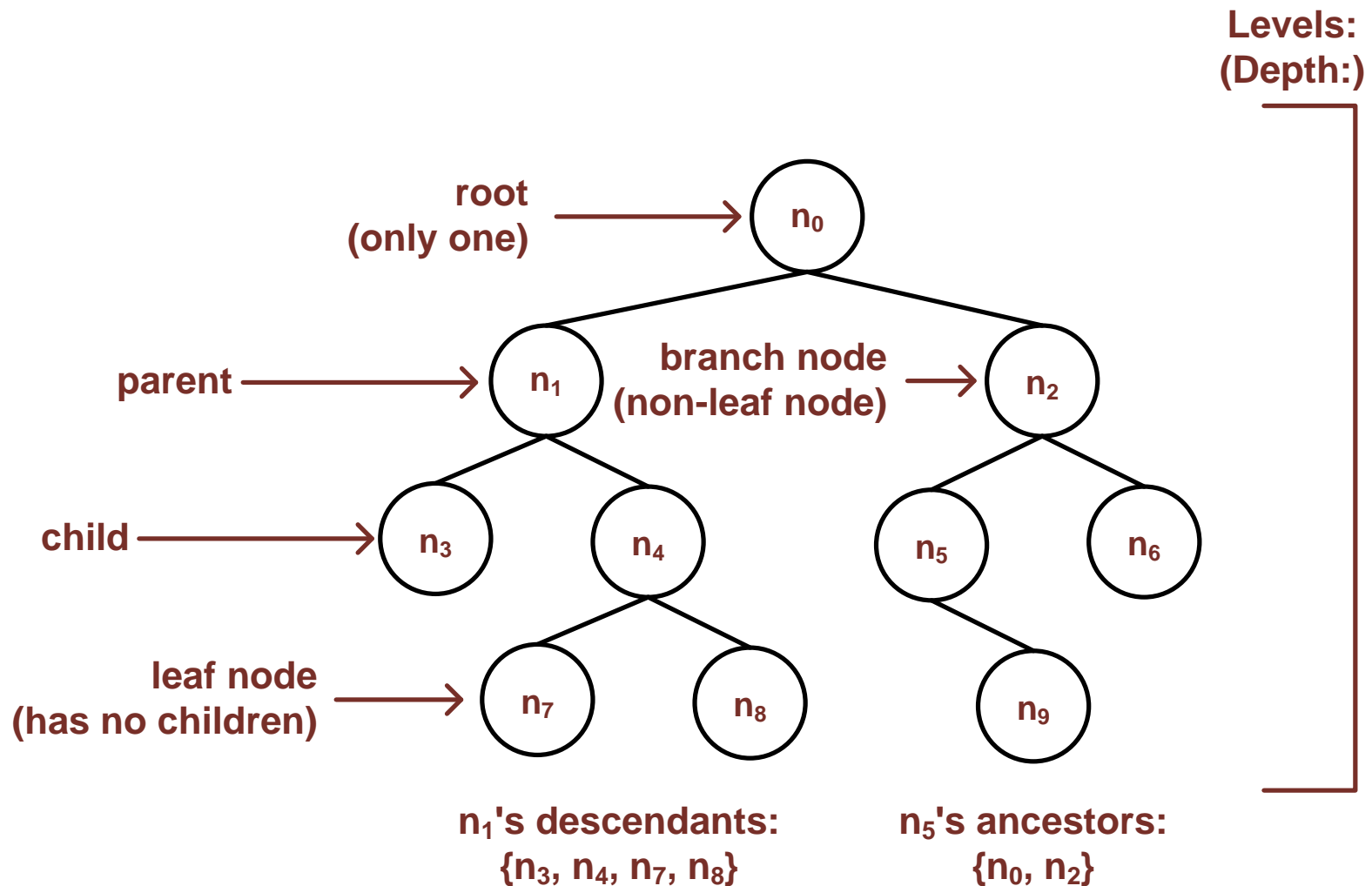
# Introduction to Trees /1

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- **Tree (T) is a hierarchical data structure composed of linked nodes connected by edges**
  - There is one root node for the entire structure
  - Each node has zero or more nodes as its children
  - Each node has at most one parent node
- All the nodes reachable from the current downwards to the bottom of the tree are its **descendants**
- All the nodes reachable from the current upwards to the root of the tree are its **ancestors**
- Typically, there is an unidirectional downwards relationship between a node and its descendants
- A node may access its descendants but descendants cannot access their ancestors

# Introduction to Trees /2

## ■ Core Tree Terminology:

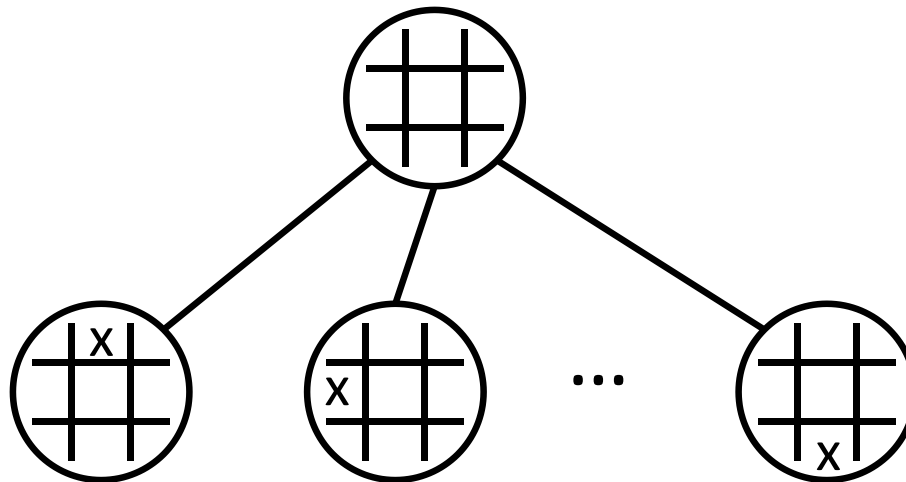


# Introduction to Trees /3

## ■ Tree Applications:

- In **artificial intelligence**, game trees are used to encode data regarding decision making
- In a **game tree**, the nodes represent the possible outcomes of making a move or decision
- At the same time, the edges between the nodes represent possible moves or decisions

## ■ Example: Tic-Tac-Toe Game Tree





# Introduction to Trees /4

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- TIP #1: A powerful outcome of using trees is they usually give us a runtime containing  $\log(n)$ . Why?

# Introduction to Trees /5

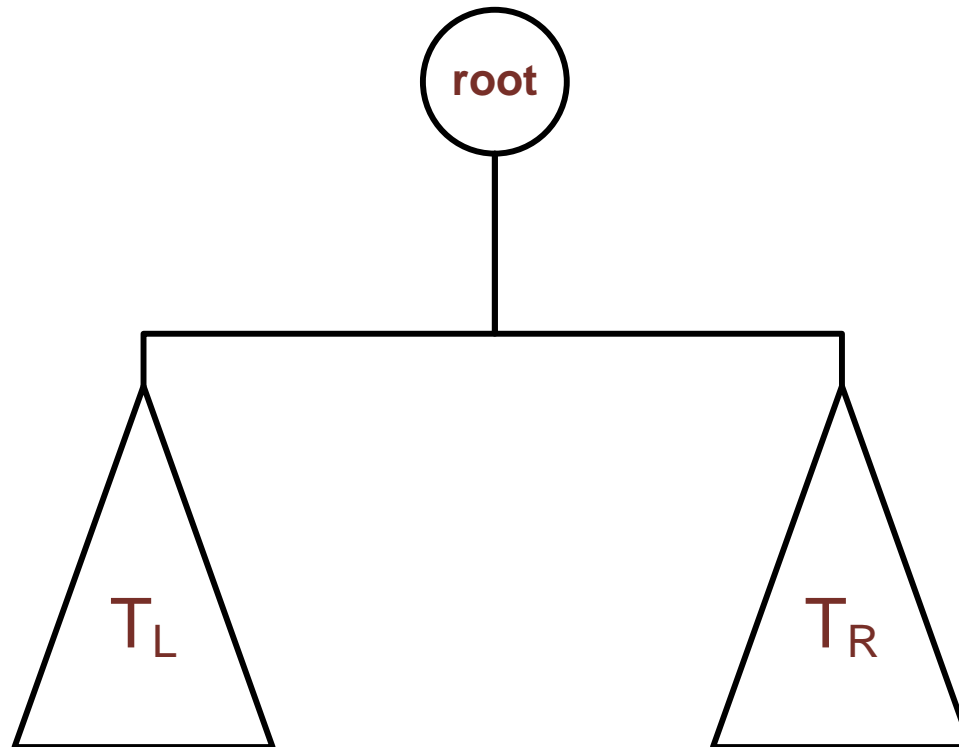
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- TIP #2: [visualgo.net](https://visualgo.net) is a great resource for visualization tree operations (i.e., study guide)

# Binary Tree /1

## ■ Binary Tree

- A finite set of nodes that is either empty or it consists of a root and two disjoint binary trees,  $T_L$  and  $T_R$



# Binary Tree /2

## ■ BinaryTreeNode Implementation:

BinaryTreeNode
-iData : int -*leftChild : BinaryTreeNode -*rightChild : BinaryTreeNode
+BinaryTreeNode() +~BinaryTreeNode() +left() : BinaryTreeNode +right() : BinaryTreeNode

```
class BinaryTreeNode {  
    int iData; //holds the data value at this tree node  
    BinaryTreeNode *leftChild; //points to left child  
    BinaryTreeNode *rightChild; //points to right child  
public:  
    BinaryTreeNode(); //default constructor  
    ~BinaryTreeNode(); //destructor  
  
    BinaryTreeNode left(); //returns left child  
    BinaryTreeNode right(); //returns right child  
};
```

# Binary Tree /3

## ■ Binary Tree Node Depth

- The length of the path from the root to the current node (counting the edges)

## ■ Binary Tree Height

- The length of the longest path from the root to a leaf node (counting the edges)

## ■ Algorithm: Height(T) (recursive)

- Input: BinaryTreeNode T
- Output: the height of the binary tree T as an integer
- Steps:

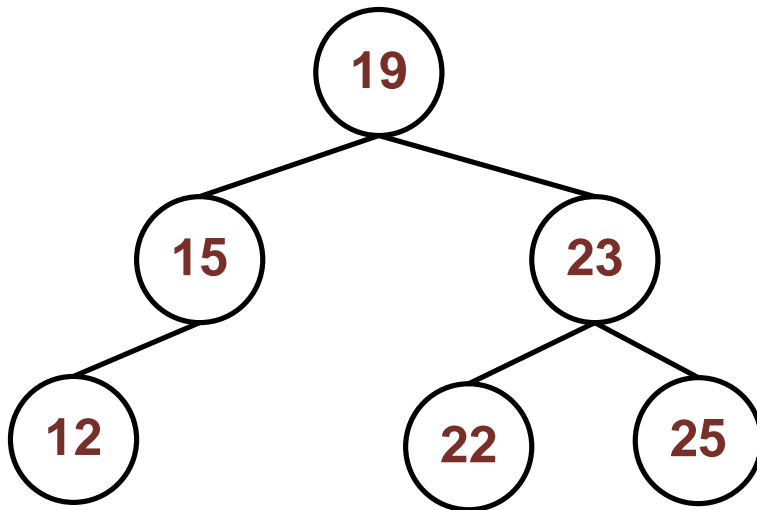
```
int Height(BinaryTreeNode* T)
    if (T == NULL) return -1; // returns -1 for an empty tree
    else return 1 + max(Height(T->leftChild), Height(T->rightChild));
```

# Complete Binary Tree /1

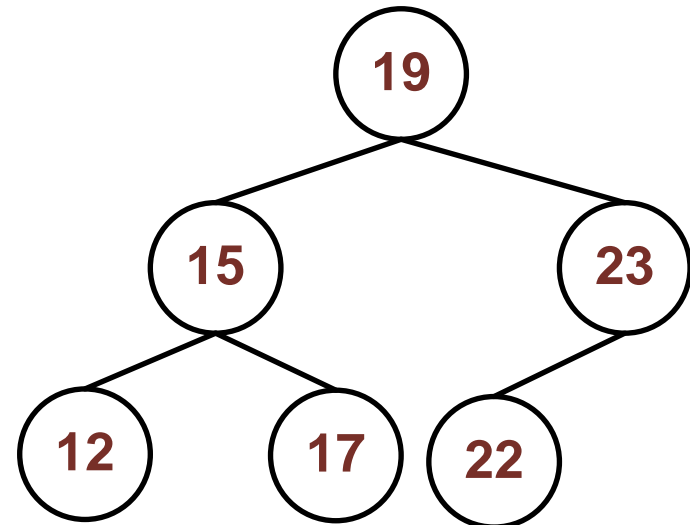
## ■ Complete Binary Tree:

- A binary tree that is completely filled at all levels with the exception of the bottom-most level
- At the bottom-most level, all leaf nodes are **as far left as possible**

**Not** a complete binary tree:



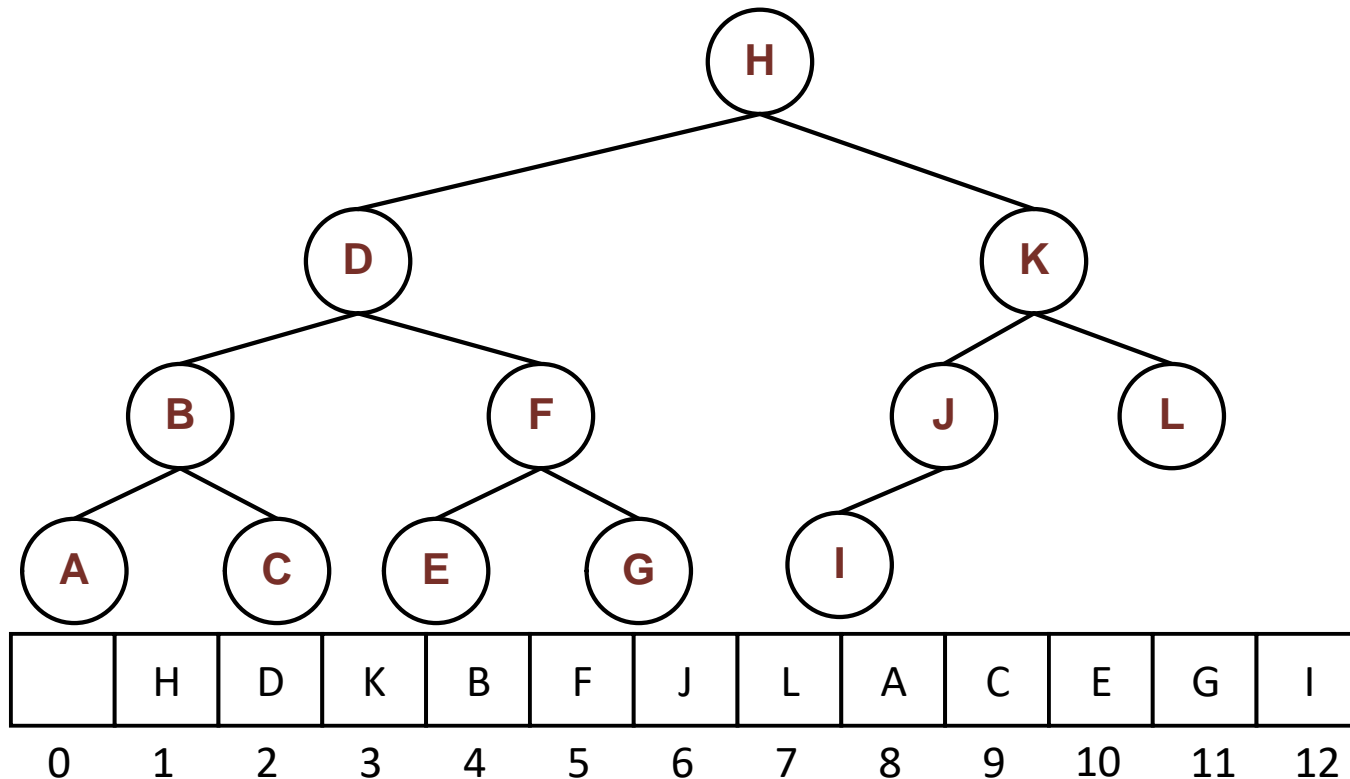
Complete binary tree:



# Complete Binary Tree /2

## ■ Complete Binary Tree Access Formulas:

- Root node: array index 1
- Parent of node  $i$ :  $\text{floor}(i/2)$
- Left child of node  $i$ :  $\text{floor}(2i)$
- Right child of node  $i$ :  $\text{floor}(2i + 1)$
- Is node  $i$  a leaf: check if  $n < 2i$



# Complete Binary Tree /3

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- Why are complete binary trees helpful?
  - Maintains non-linear hierarchical structure
  - Approximate knowledge of height
  - Compact array representation
- All helpful for runtime of algorithms!

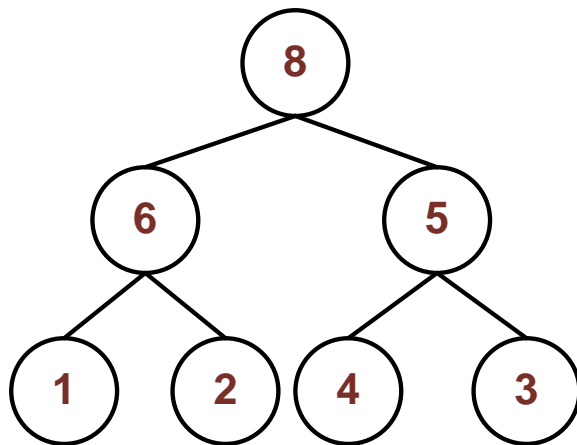


# Heaps /1

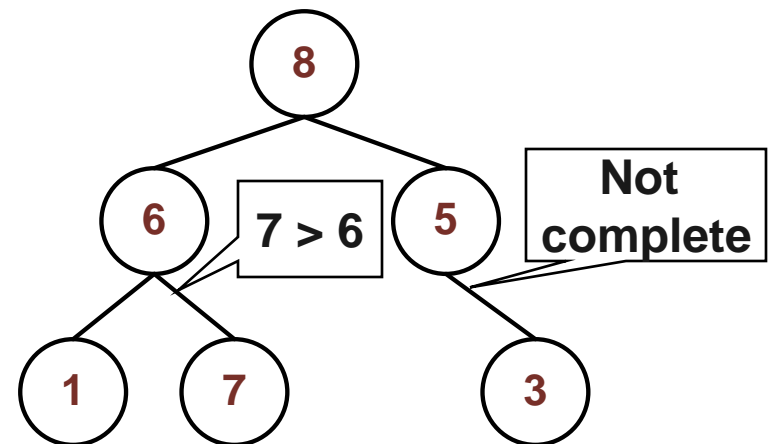
## ■ Heap:

- A binary tree with keys or (key,value) pairs stored in its nodes
- A heap is a **complete tree**
- **max-heap**: all children smaller or equal to parent
- **min-heap**: all children larger or equal to parent

## ■ Max-Heap Example:



## Not a Max-Heap:



# Heaps /2

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## ■ **(Max) Heap Properties:**

- The root of a heap contains the largest key value
- The subtree rooted at any node of a heap is also a heap
- Remainder of array is “partially unsorted”
- A heap can be represented as an array with relations between nodes computed using array indices

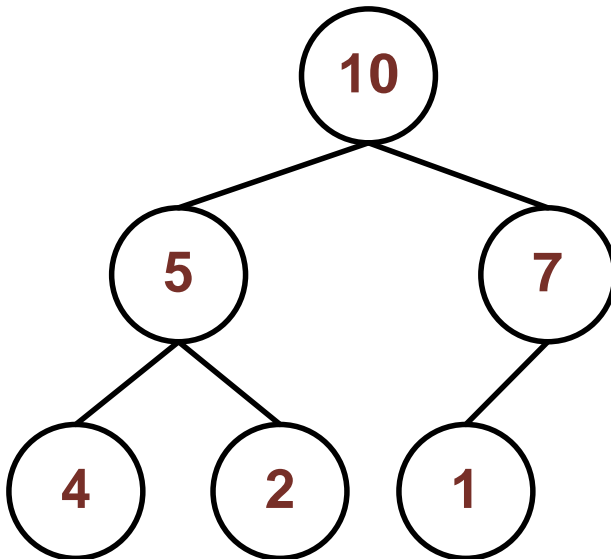
## ■ **Heap Applications:**

- Sorting values since the largest value in a heap will always be at the top
- Priority queue, where a request of highest priority needs to be the dequeued first
- CPU scheduling
- Other?

# Heaps /3

## ■ Heap as an Array – Access Formulas:

- Root node: index 1
- Parent of node  $i$ :  $\text{floor}(i/2)$
- Left child of node  $i$ :  $\text{floor}(2i)$
- Right child of node  $i$ :  $\text{floor}(2i + 1)$
- Is node  $i$  a leaf: check if  $n < 2i$



0	1	2	3	4	5	6
	10	5	7	4	2	1

# Heaps /4

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- **Heap ADT Operations:**

- **Insert:** insert a node into the heap
- **Remove:** remove a node from the heap
- **Heapify:** turn a binary tree into a heap

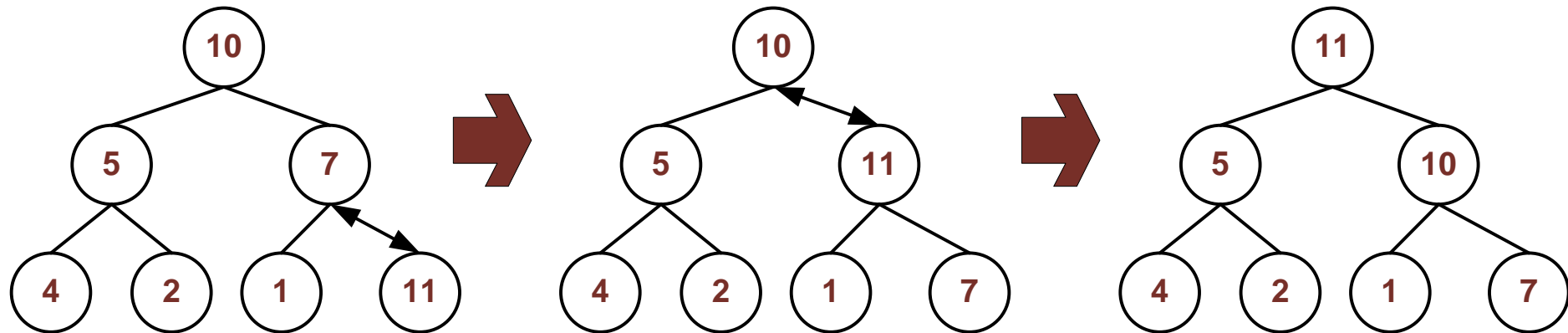
- **Insert(Node):**

1. Insert node as bottom-right-most leaf in the tree
2. If the parent has a smaller value than the node, switch places with the parent
3. Continue recursing upwards
  - Until the parent has a higher (or equal) value than the node, or
  - Until the inserted node becomes the root node

# Heaps /5

## ■ Insert(11) example:

- Insert 11 as the right-most leaf node
- Ensure heap property compliance in a bottom-up manner
- Swap 7 and 11 then 10 and 11 then terminate when 11 becomes the root node



Runtime?

# Heaps /6

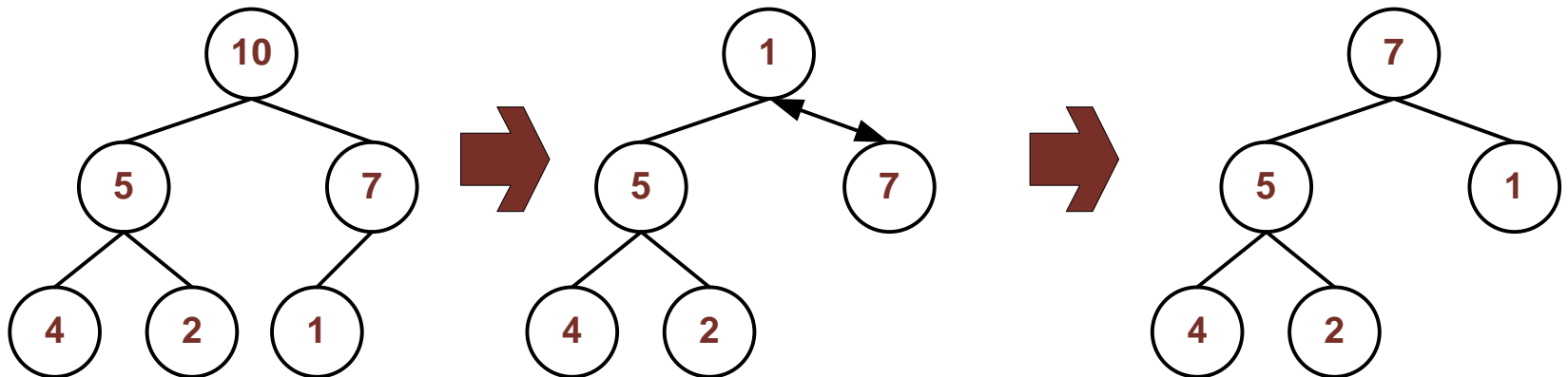
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- **Remove(Node): (always remove the root node)**
  - Replace the root node with the bottom-right-most leaf node in the tree
  - Switch the root node with the highest valued child
  - Continue recursing downwards until there is heap property compliance or until the bottom of the tree is reached

# Heaps /7

## ■ Remove(10) example:

- Swap 10 and 1 (bottom-right-most leaf node)
- Ensure heap property compliance in a top-down manner
- Swap 1 and 7 then terminate when the bottom is reached



Runtime?

**This shows power of partially ordered tree! (when we insert into bottom right)**

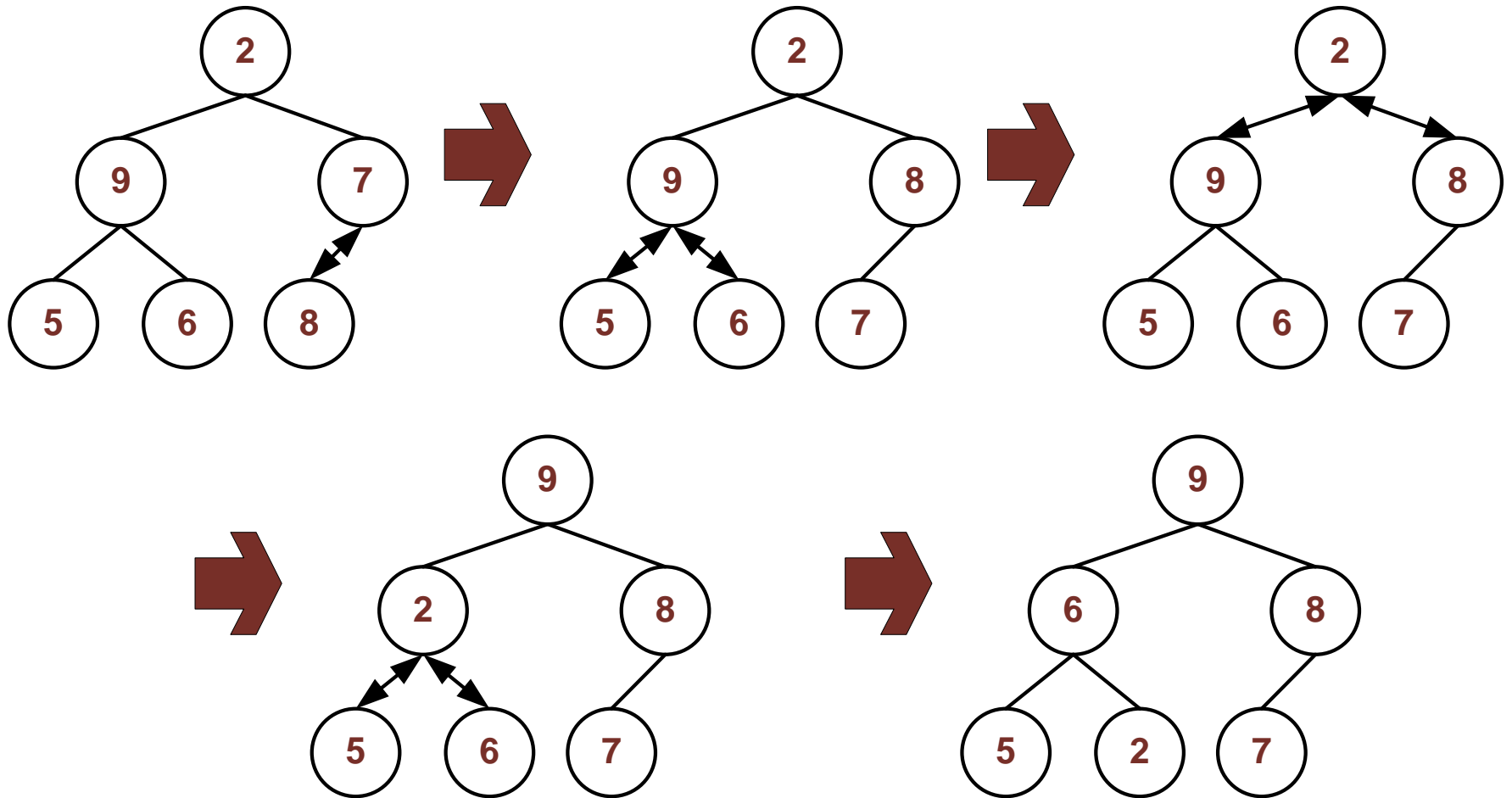
# Heaps /8

- **Could insert item-by-item into a heap:  $O(n \log n)$** 
  - Why  $O(n \log n)$ ?
- But there's a better way ( $O(n)$ ):
- **Heapify(Tree):**
  1. Enumerate the internal nodes of the **existing tree** in reverse level order. That is, traverse all non-leaf and non-root nodes in using reverse level-based traversal
  2. In the order of the enumerated list, ensure heap property compliance of each node in the list in a top-down manner
  3. Ensure heap property compliance of the root node of the tree in a top-down manner, and then terminate



# Heaps /9

## ■ Heapify(Tree) Example:



Runtime?

# Heaps /10

- A primary application of heaps are **priority queues**
  - Fundamental in CPU scheduling, where the OS determined which process to execute on the CPU.

