

# Lecture 2

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# Binary Search Trees

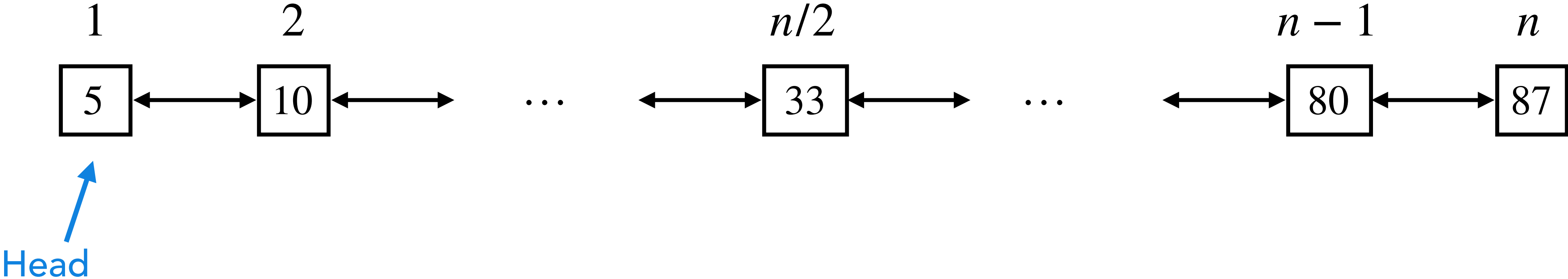
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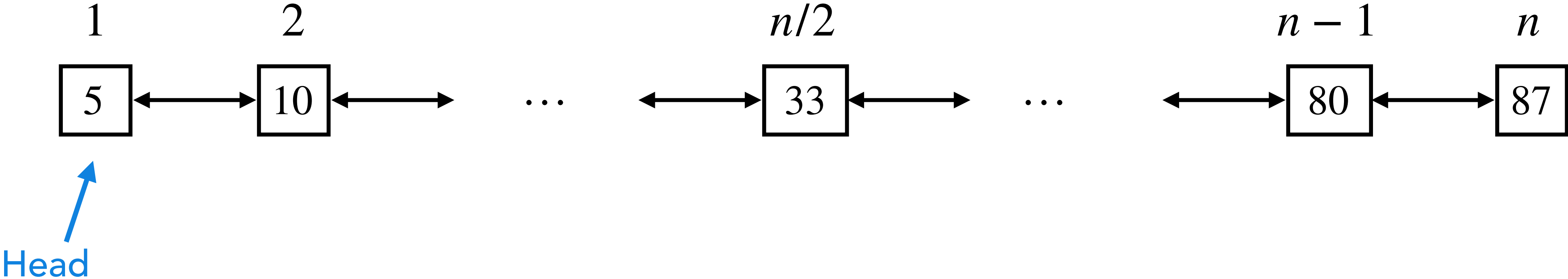


Let's first implement the operations through sorted linked list

# Linked List Implementation

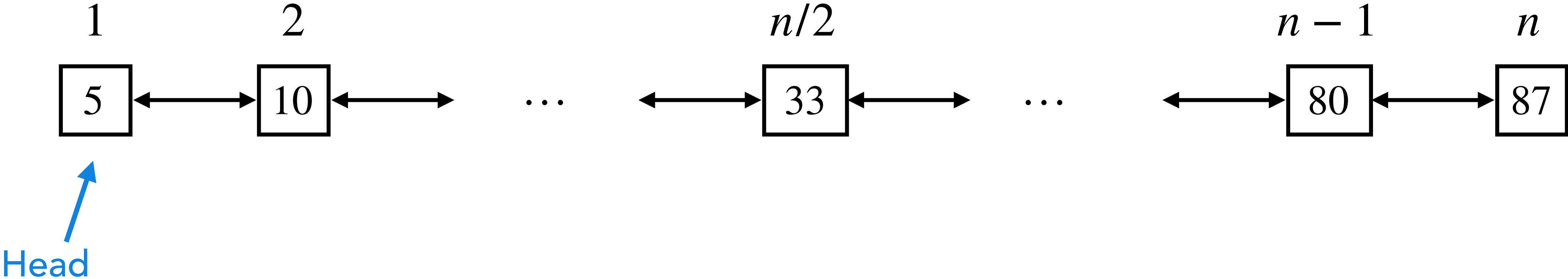


# Linked List Implementation



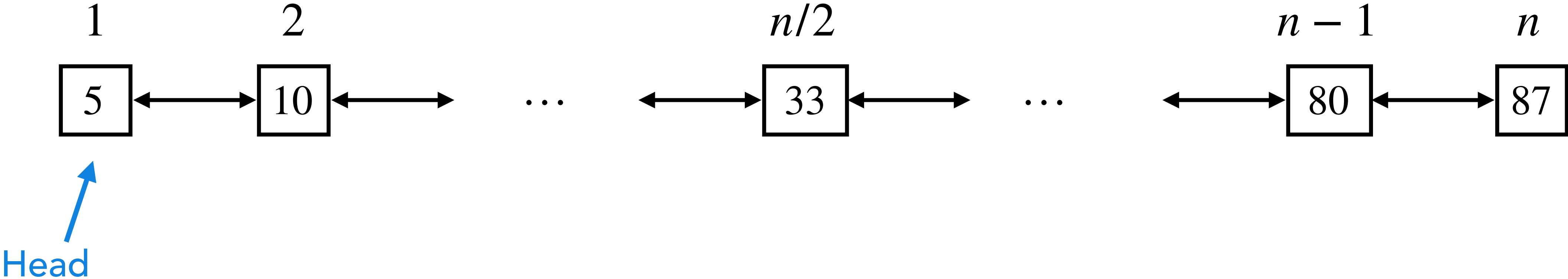
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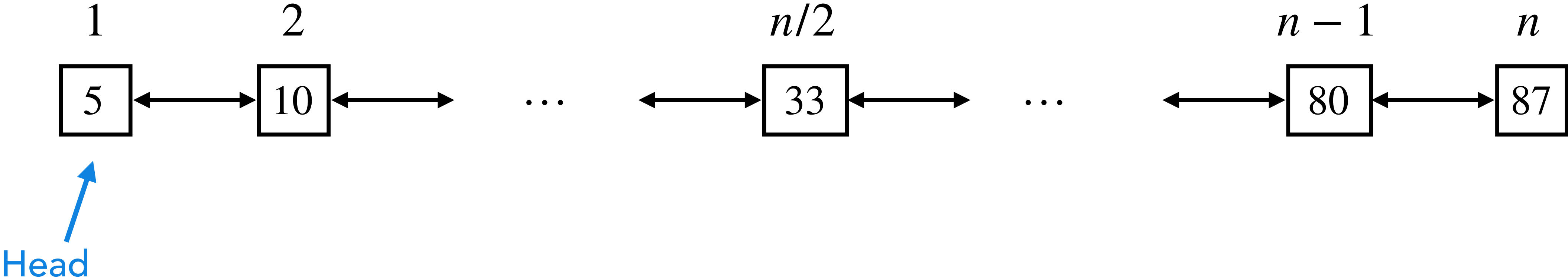
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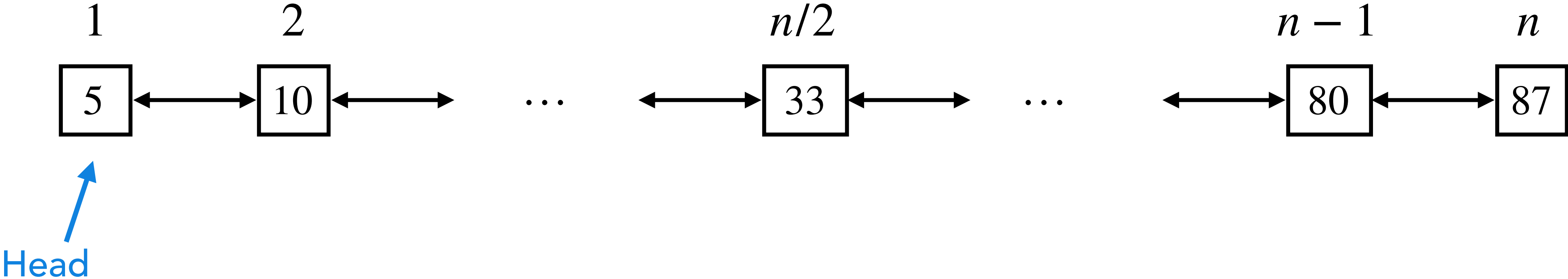
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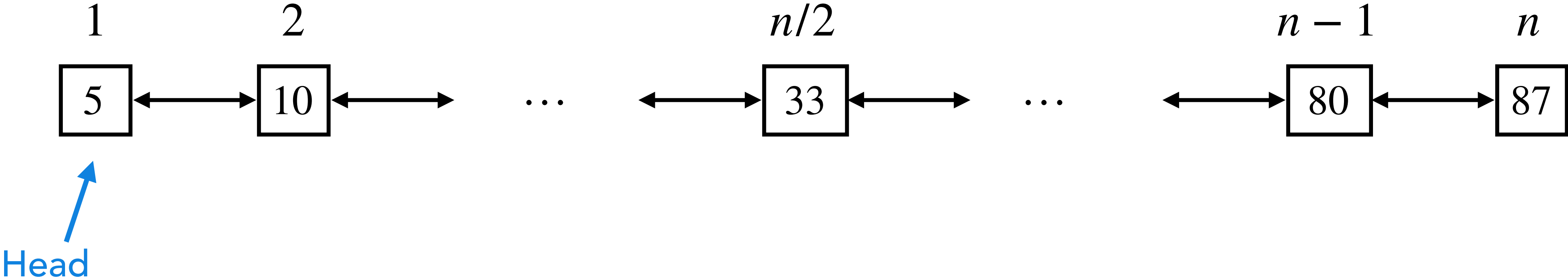
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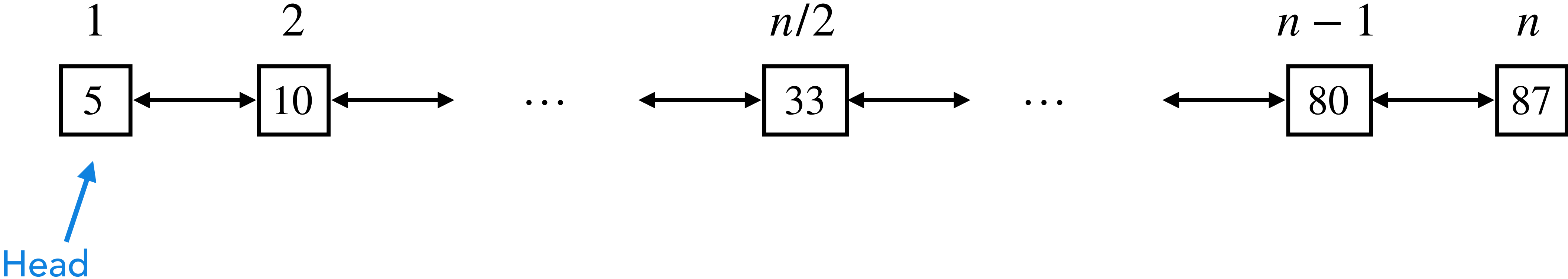
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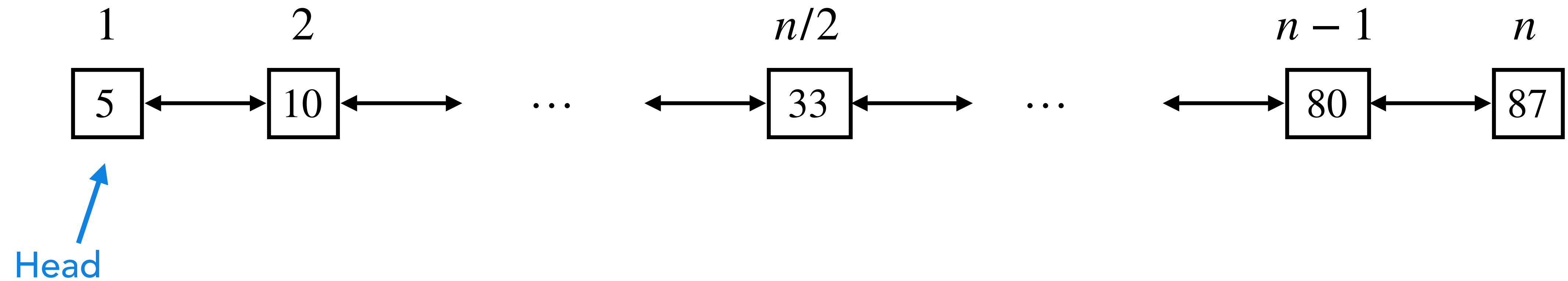
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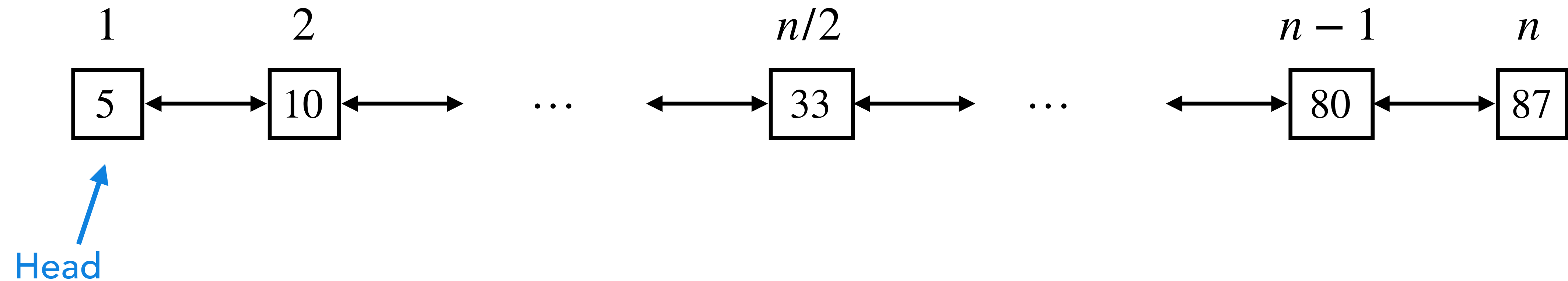
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Let's try to reduce this first

# Reducing Search Time in Linked Lists

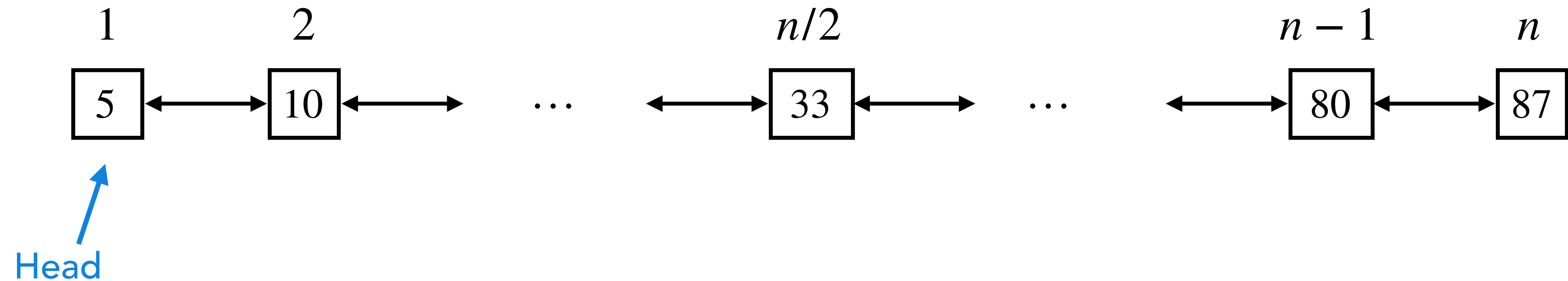


# Reducing Search Time in Linked Lists



Searching for a node may take at most  $n$  comparisons.

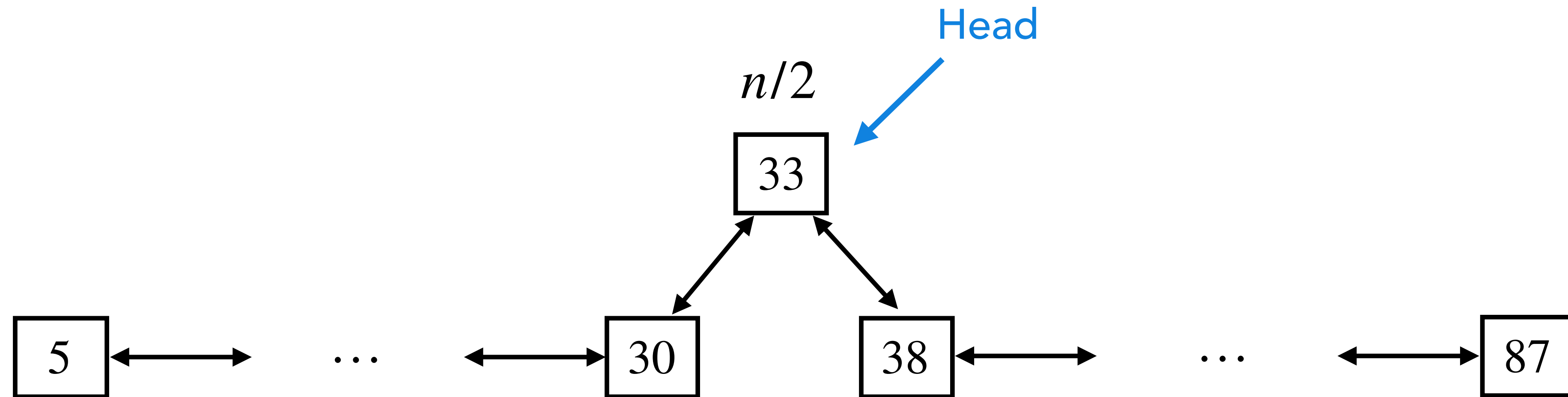
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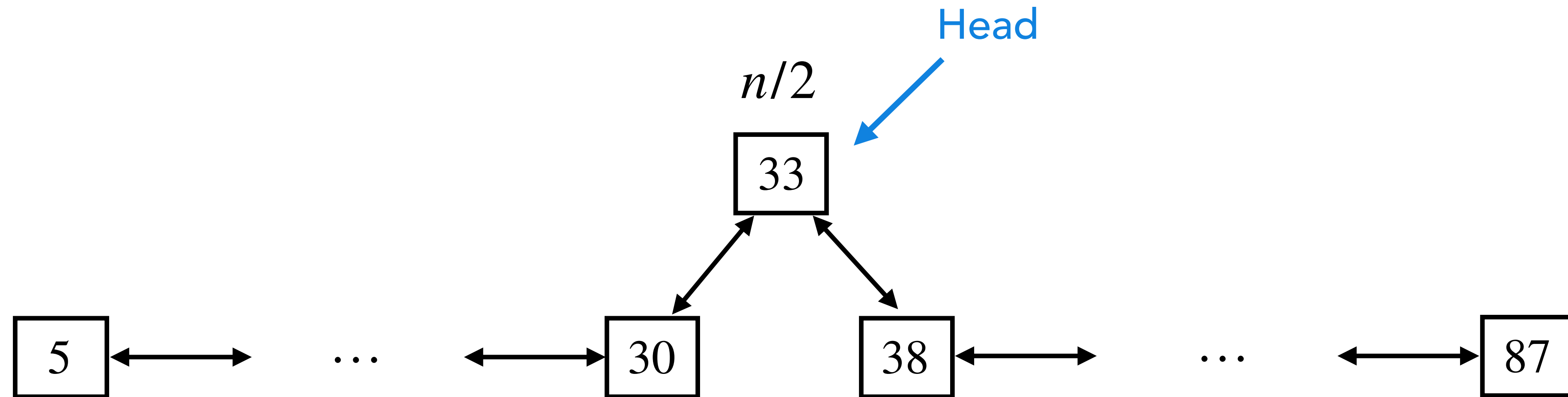
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What can be done to find a node with around  $n/2$  comparisons?

# Reducing Search Time in Linked Lists

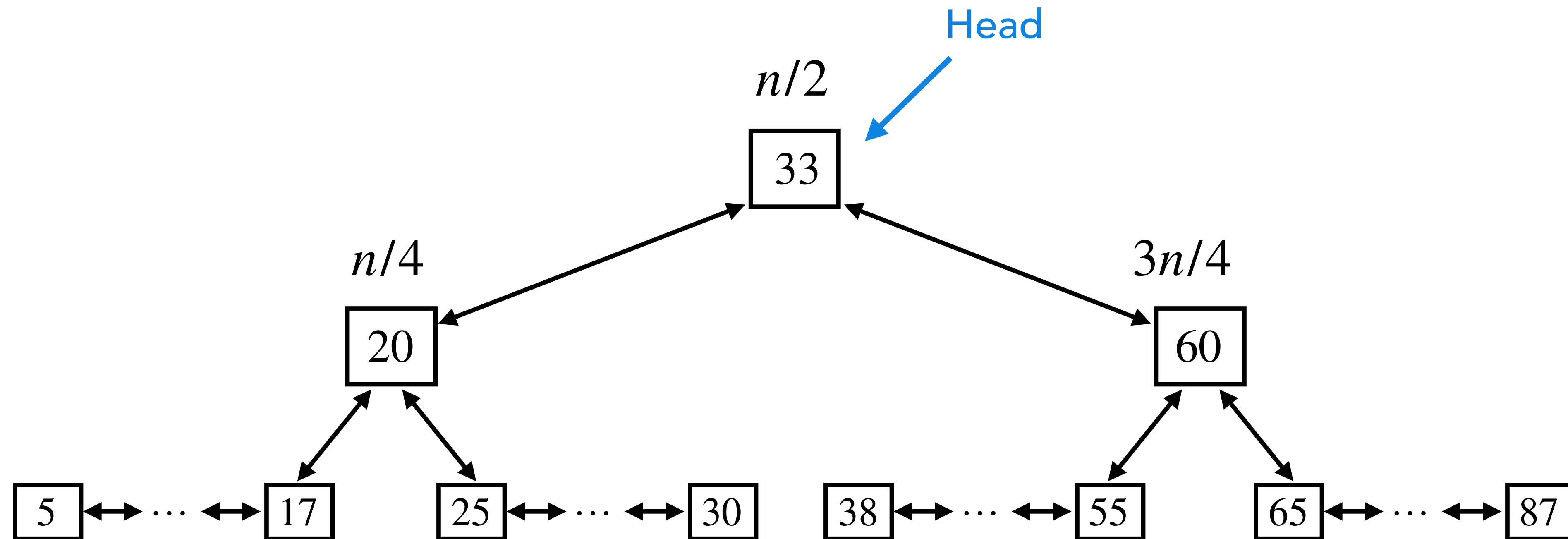


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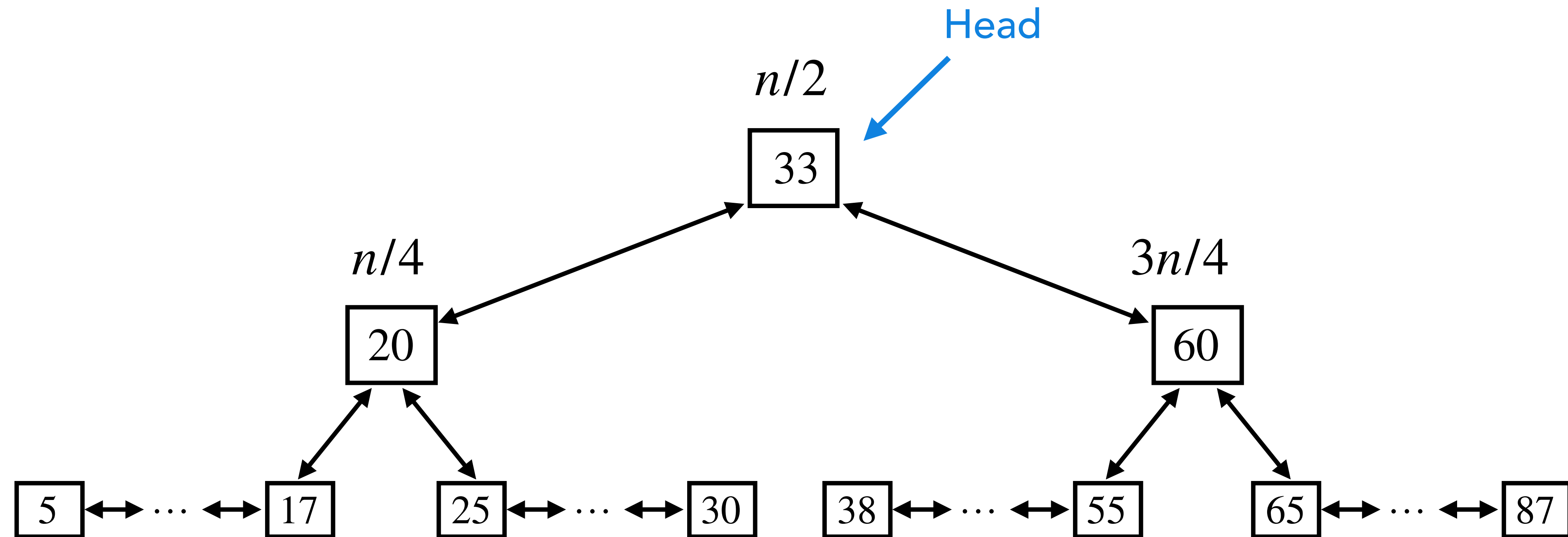


What can be done to find a node with around  $n/4$  comparisons?

# Reducing Search Time in Linked Lists



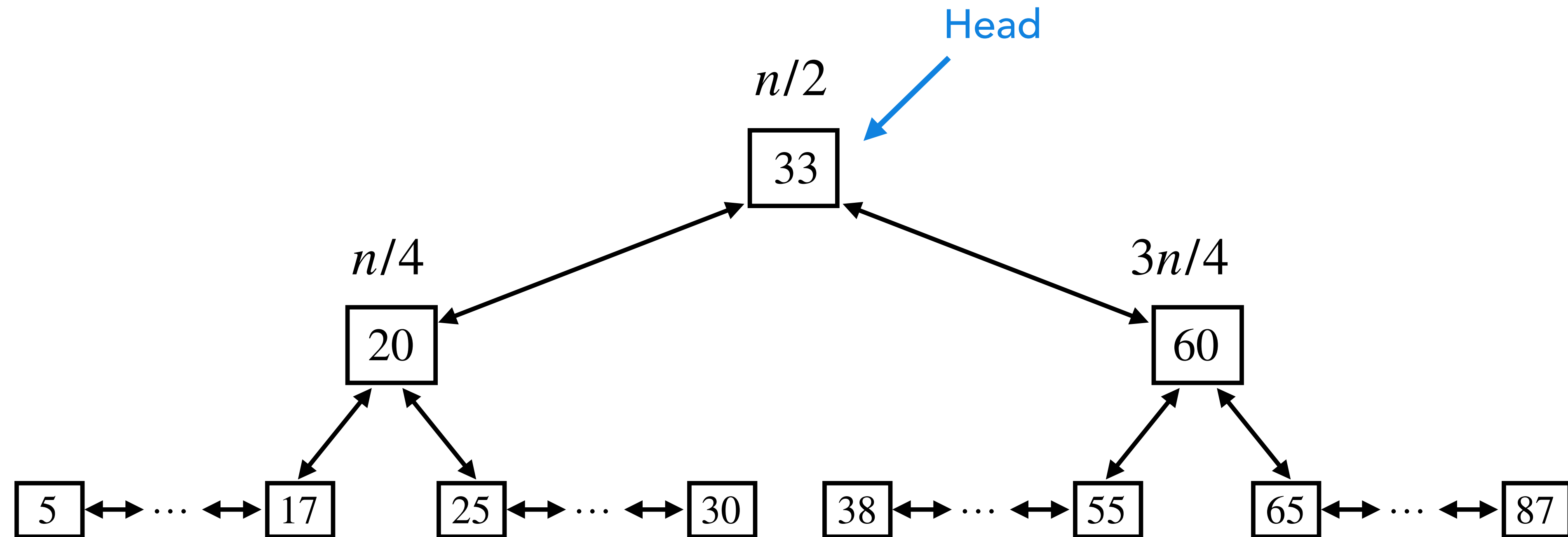
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What will happen if we continue like this?



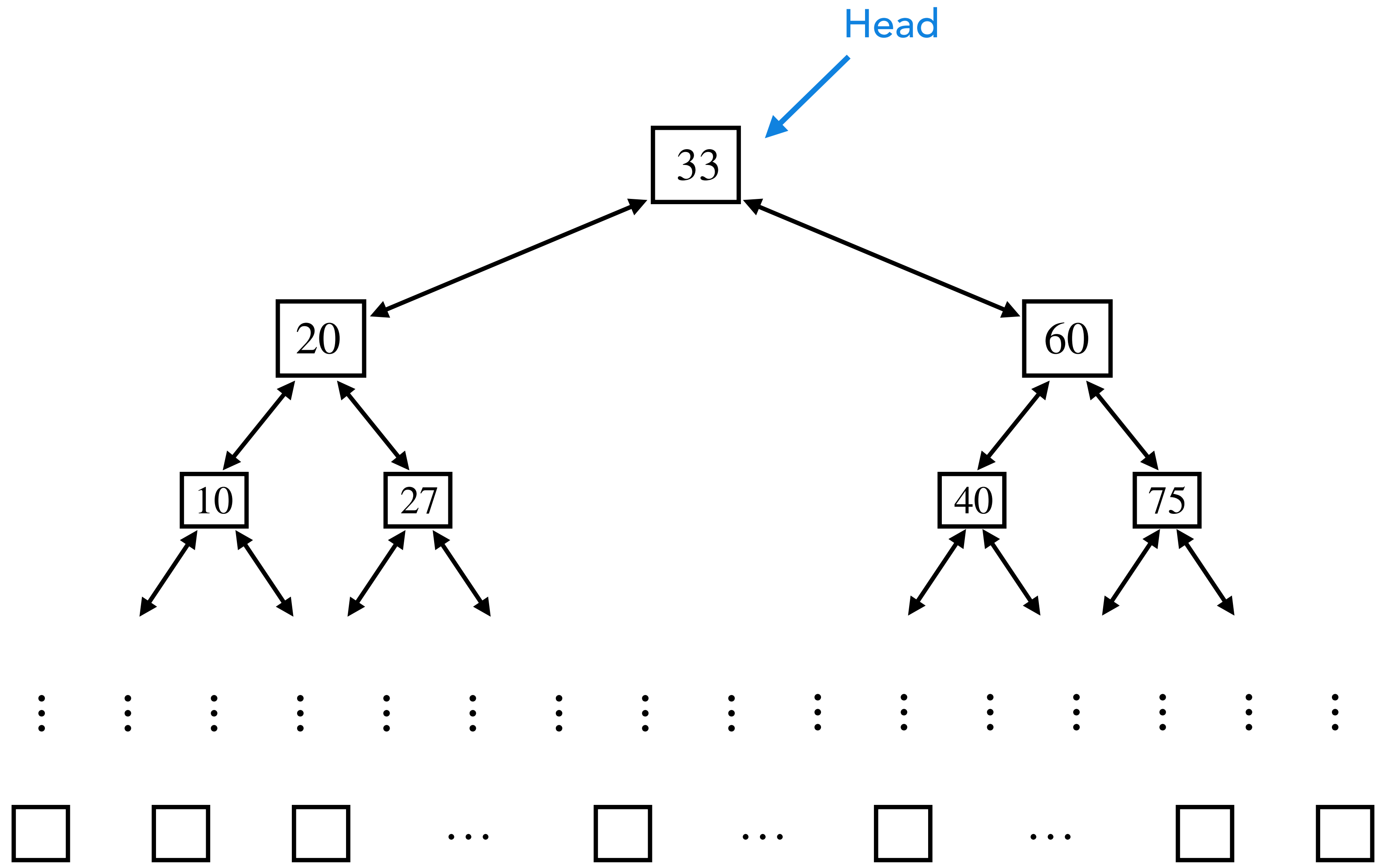
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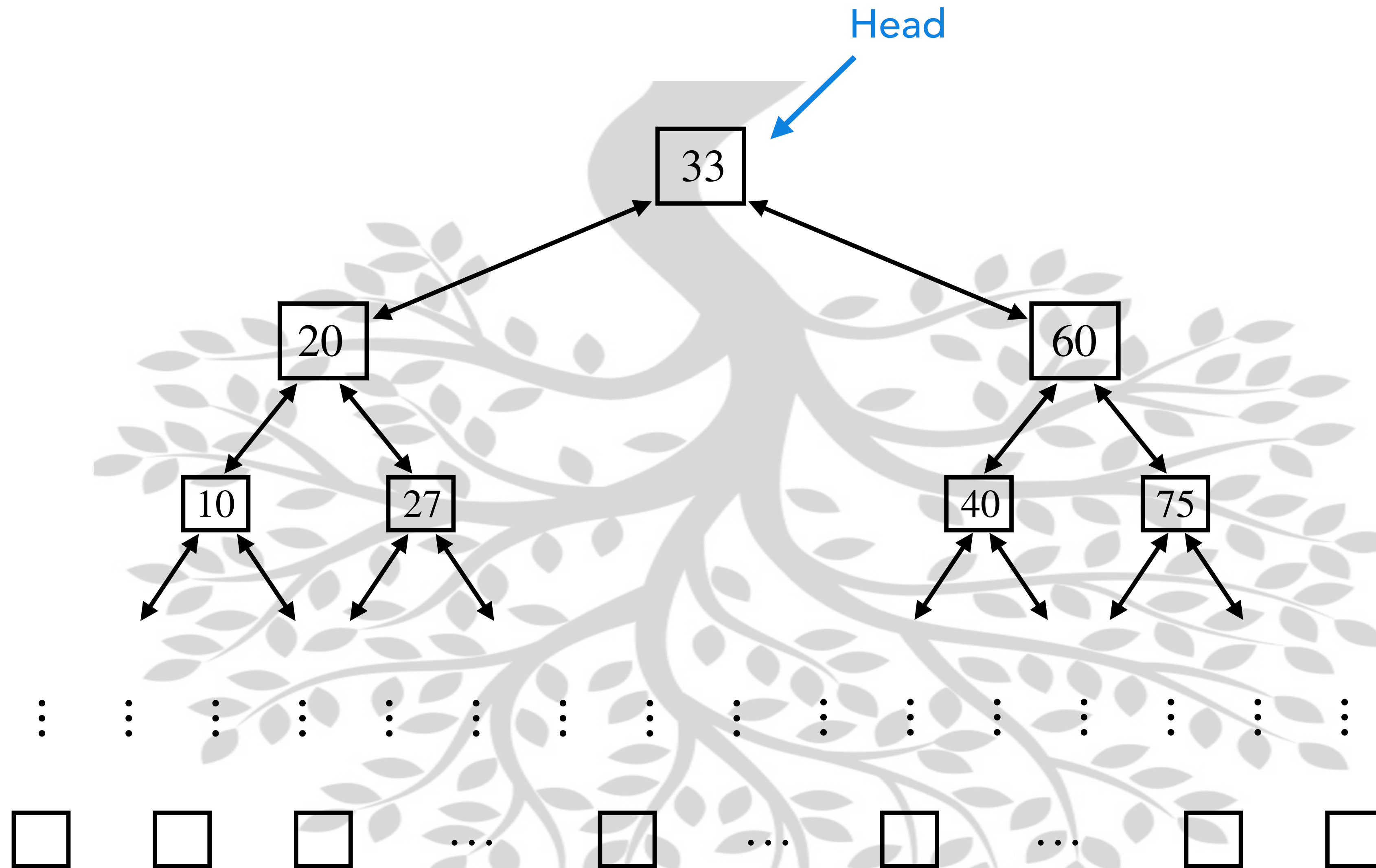
What will happen if we continue like this?

We get a binary search tree

# Binary Search Tree

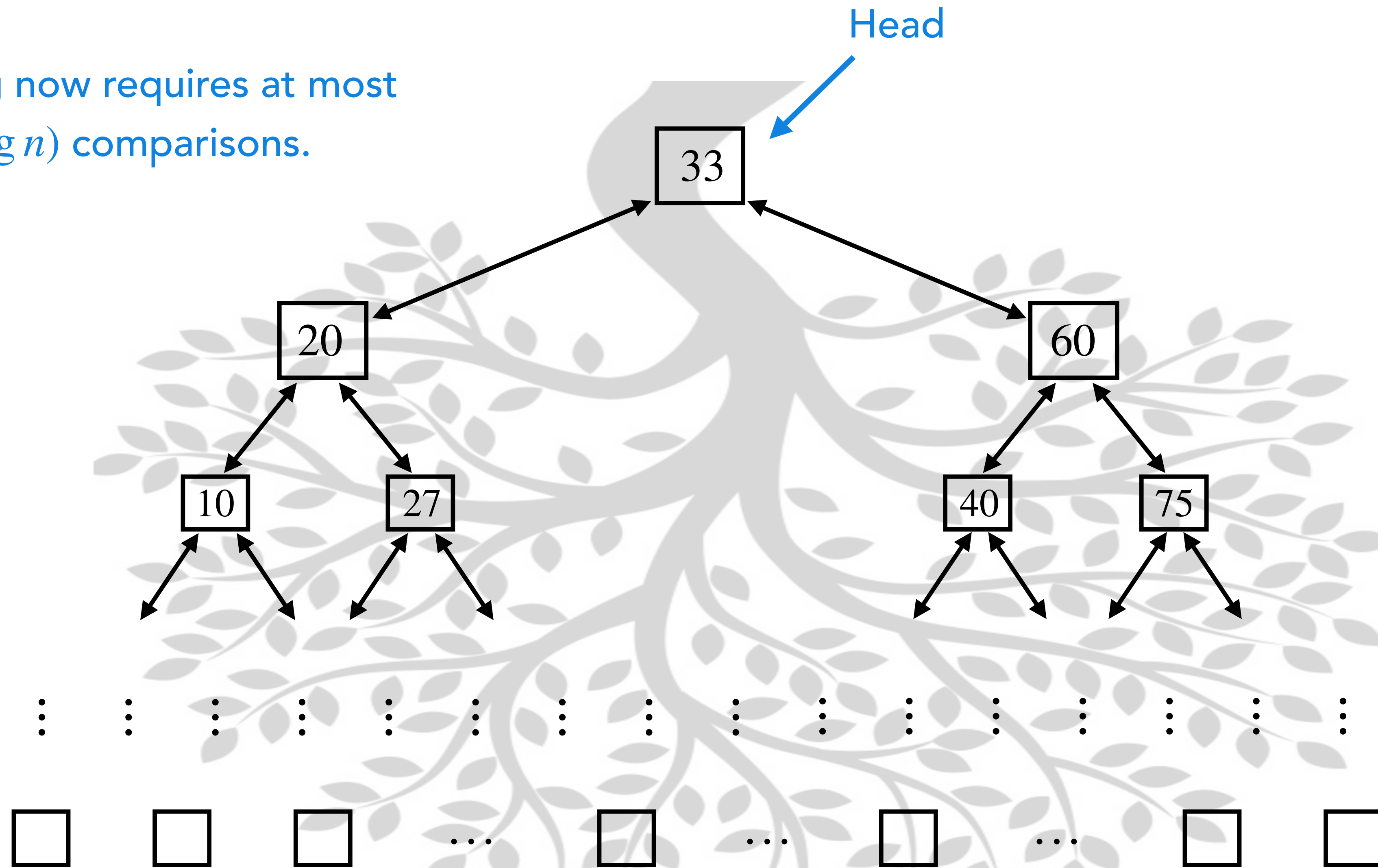


# Binary Search Tree



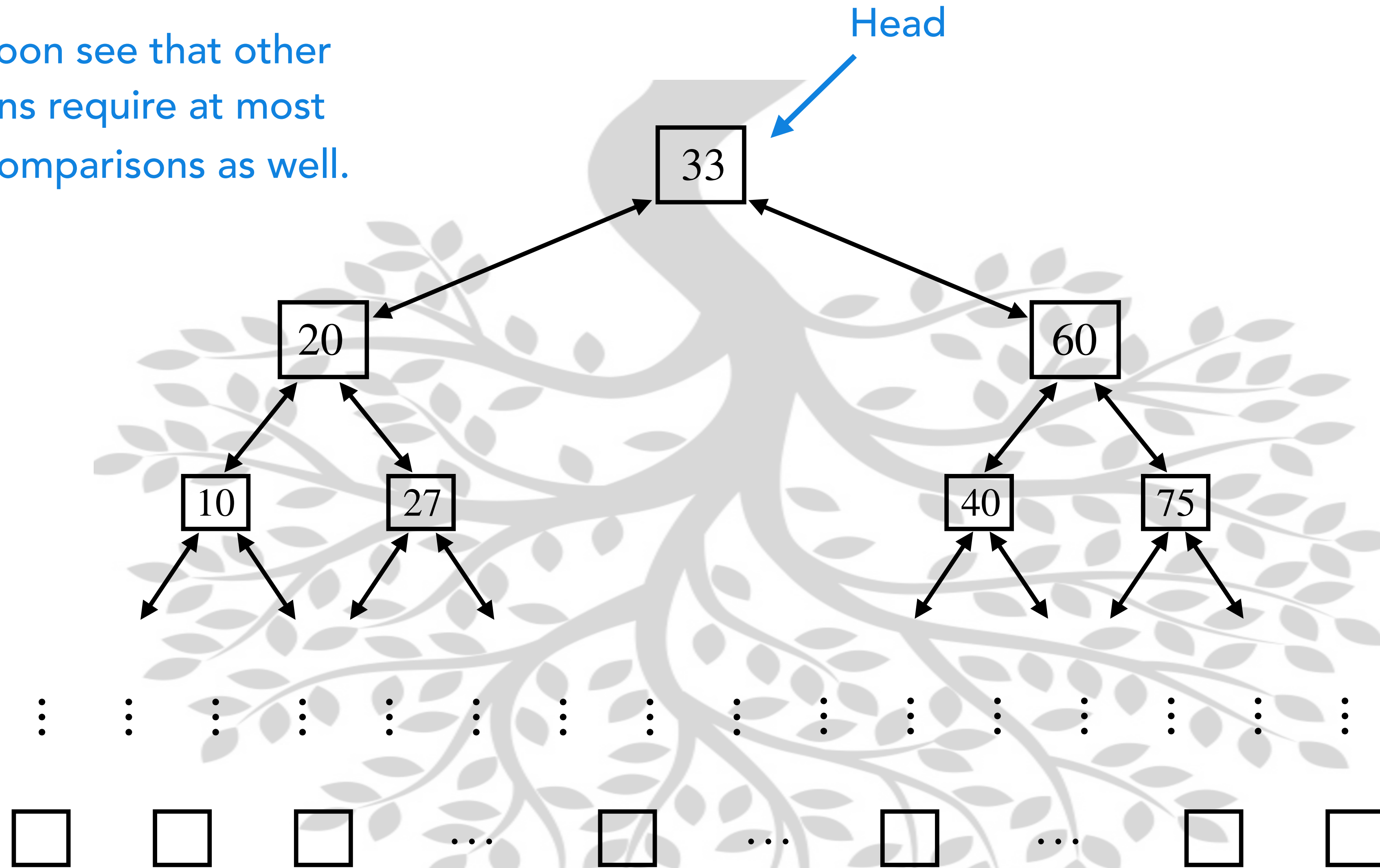
# Binary Search Tree

Searching now requires at most  
 $\Theta(\log n)$  comparisons.



# Binary Search Tree

We will soon see that other operations require at most  $\Theta(\log n)$  comparisons as well.



# Comparison of Different Data Structures

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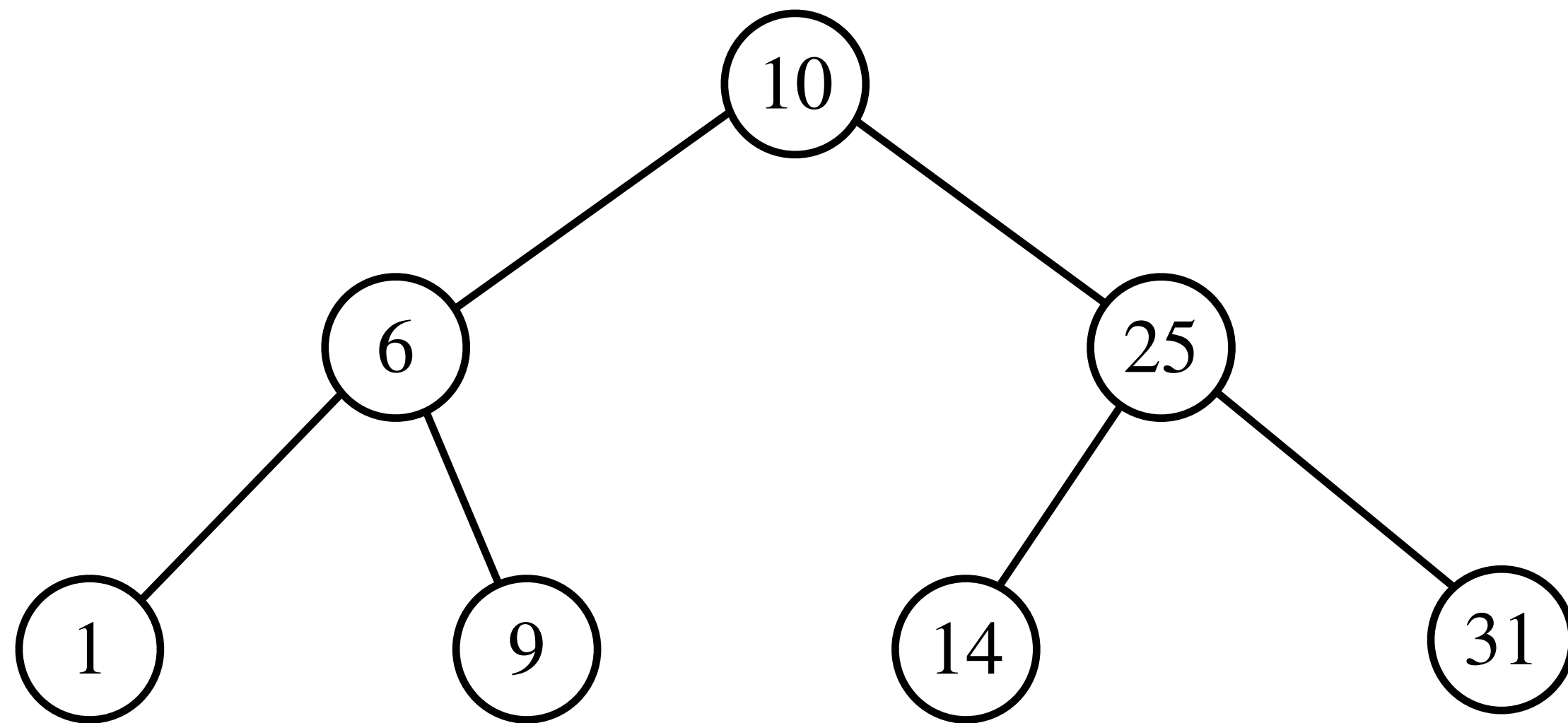
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DIY

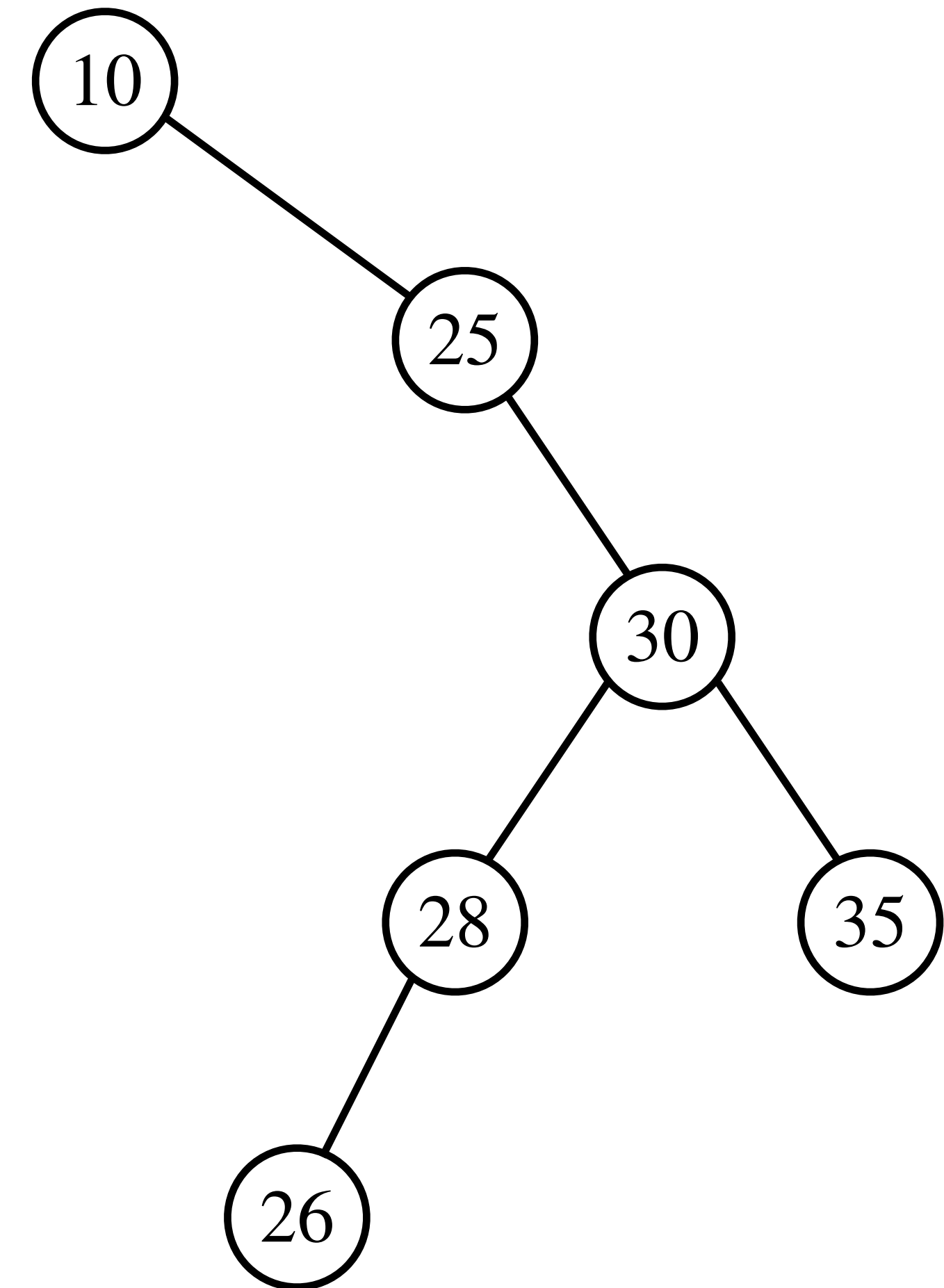
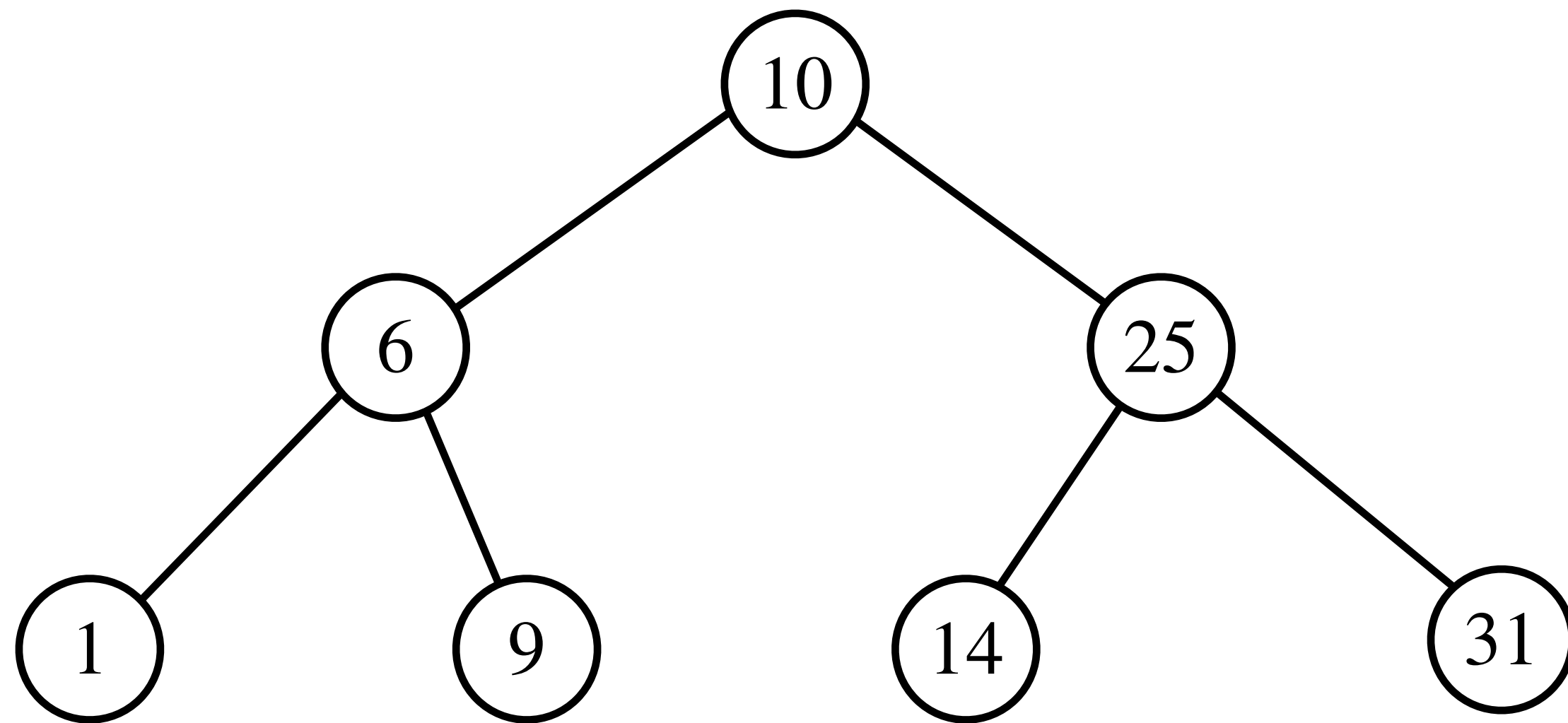
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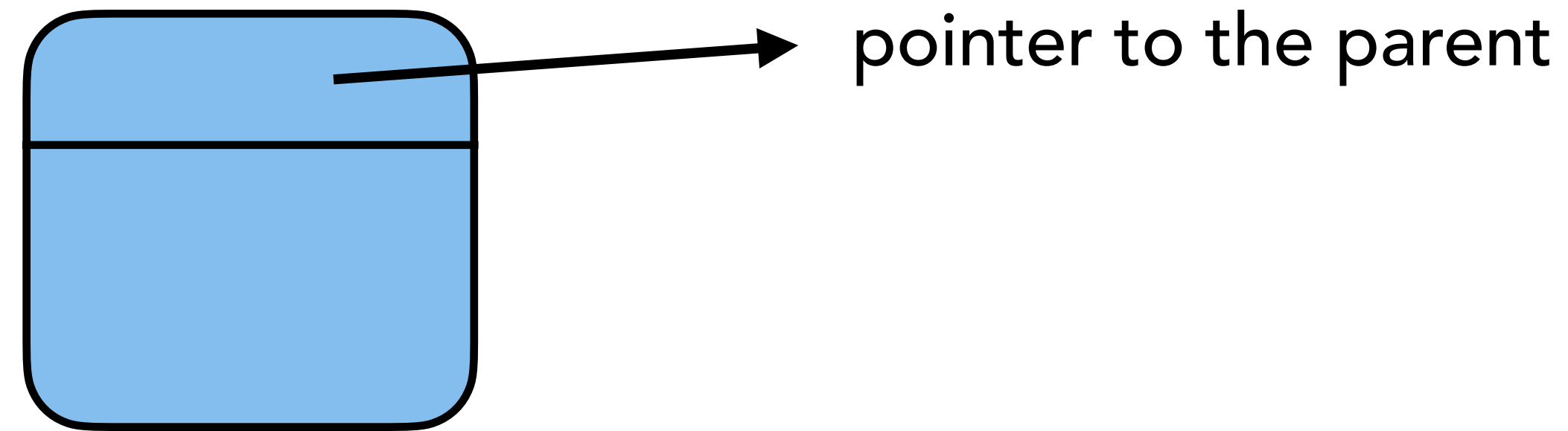
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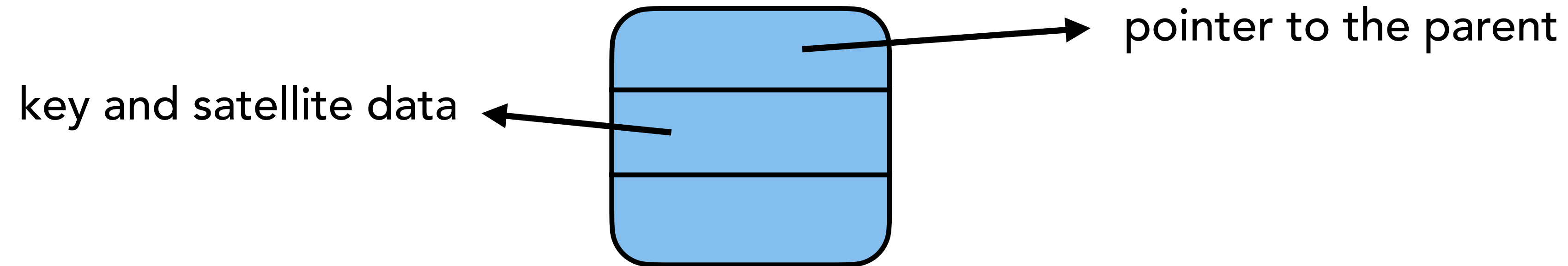
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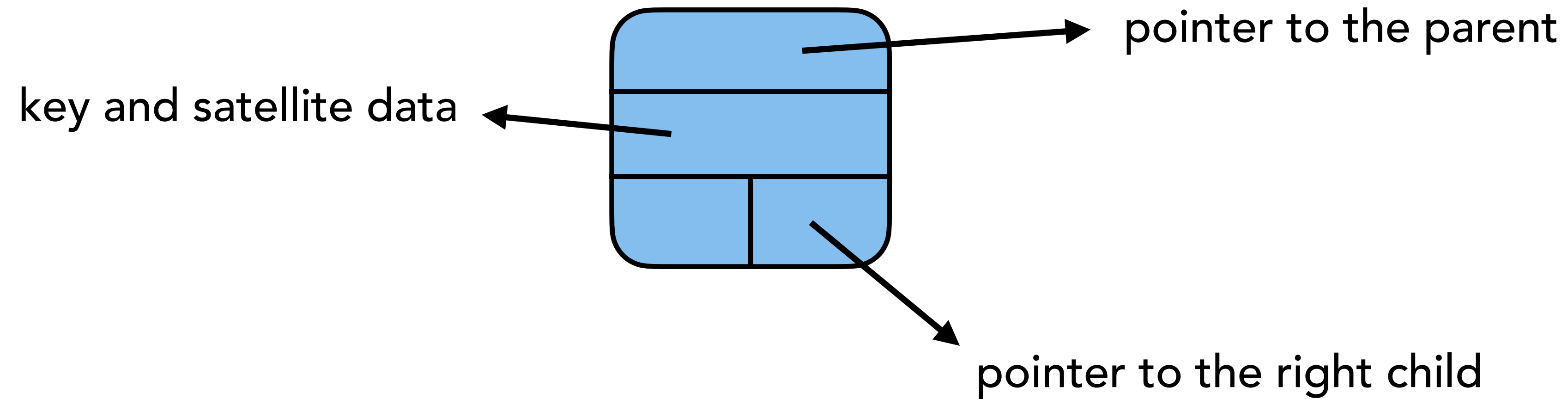
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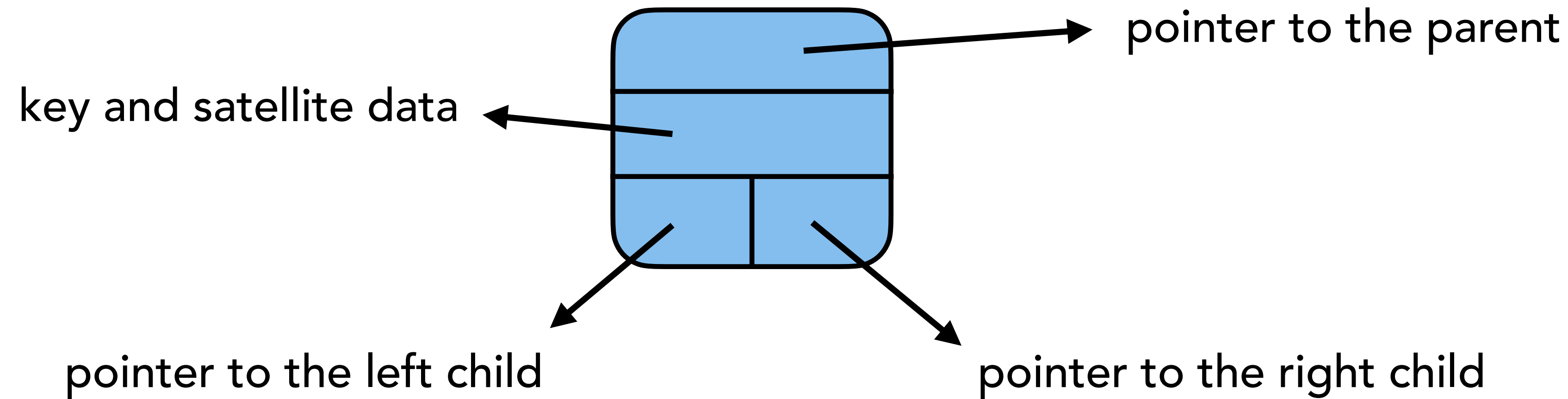
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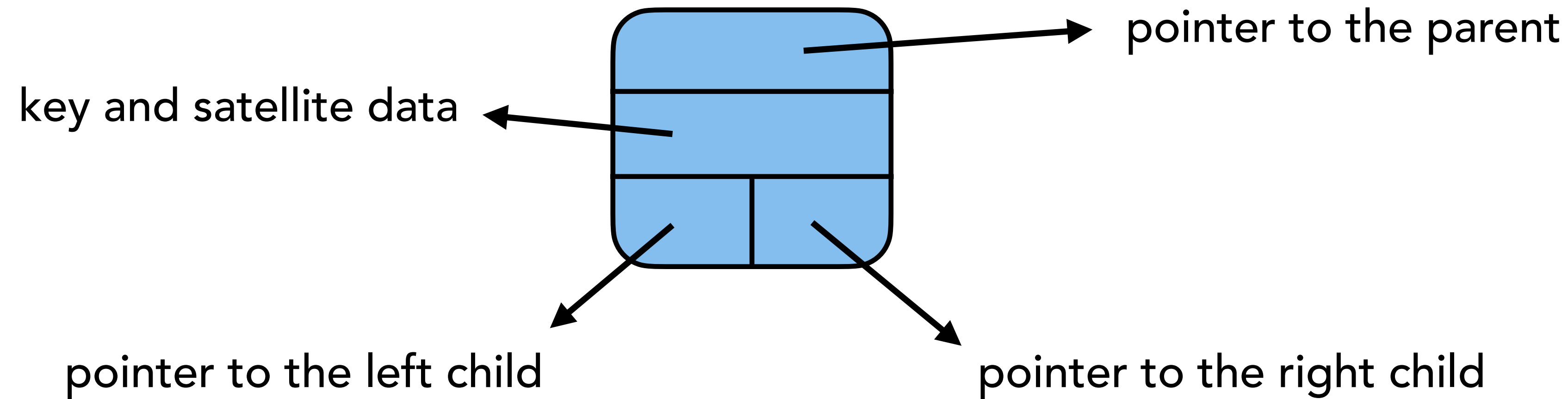
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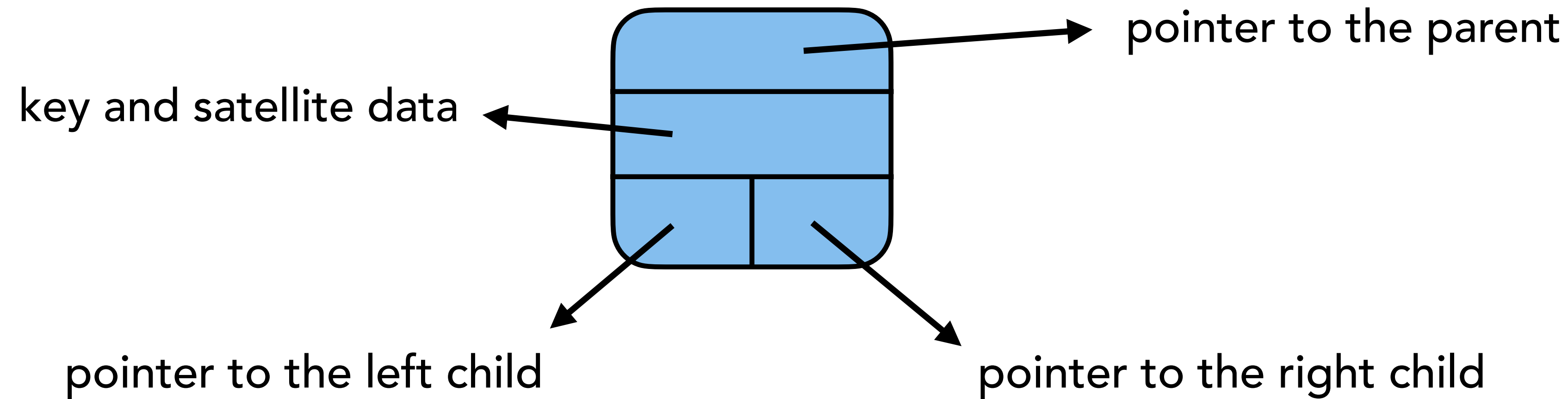
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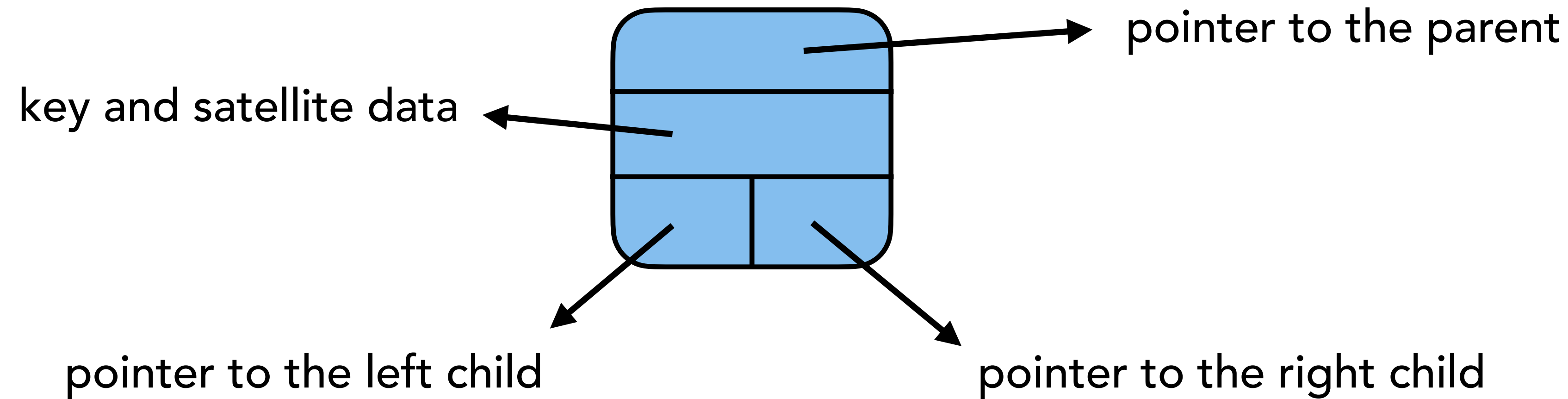
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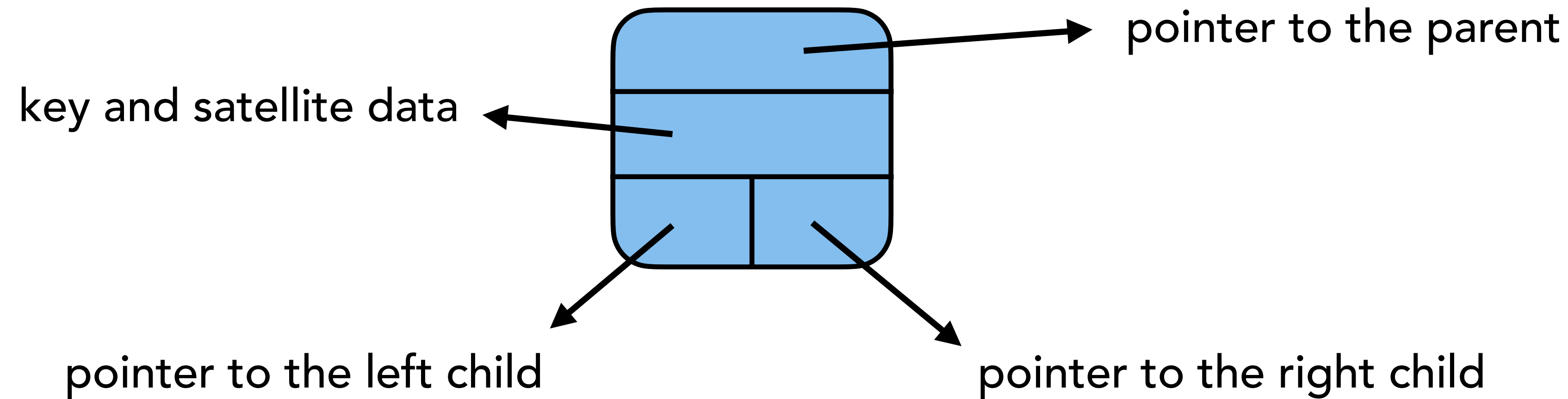
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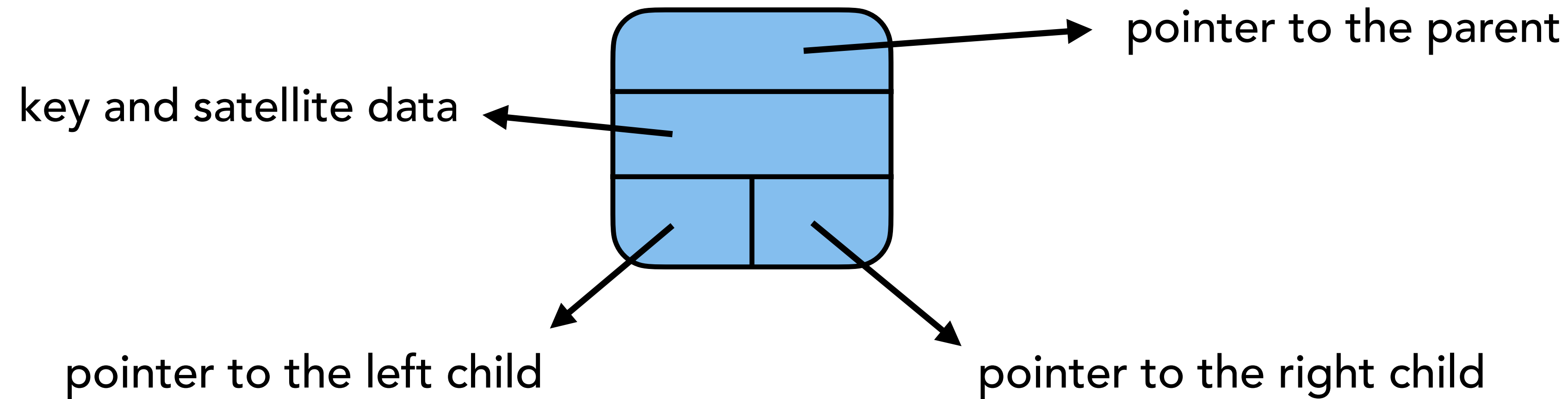


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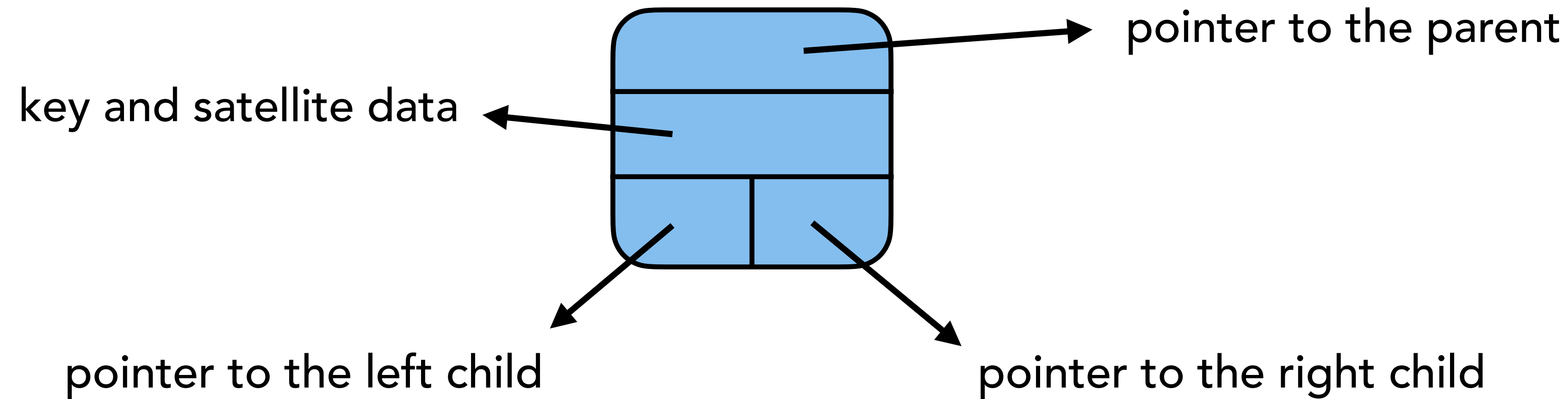
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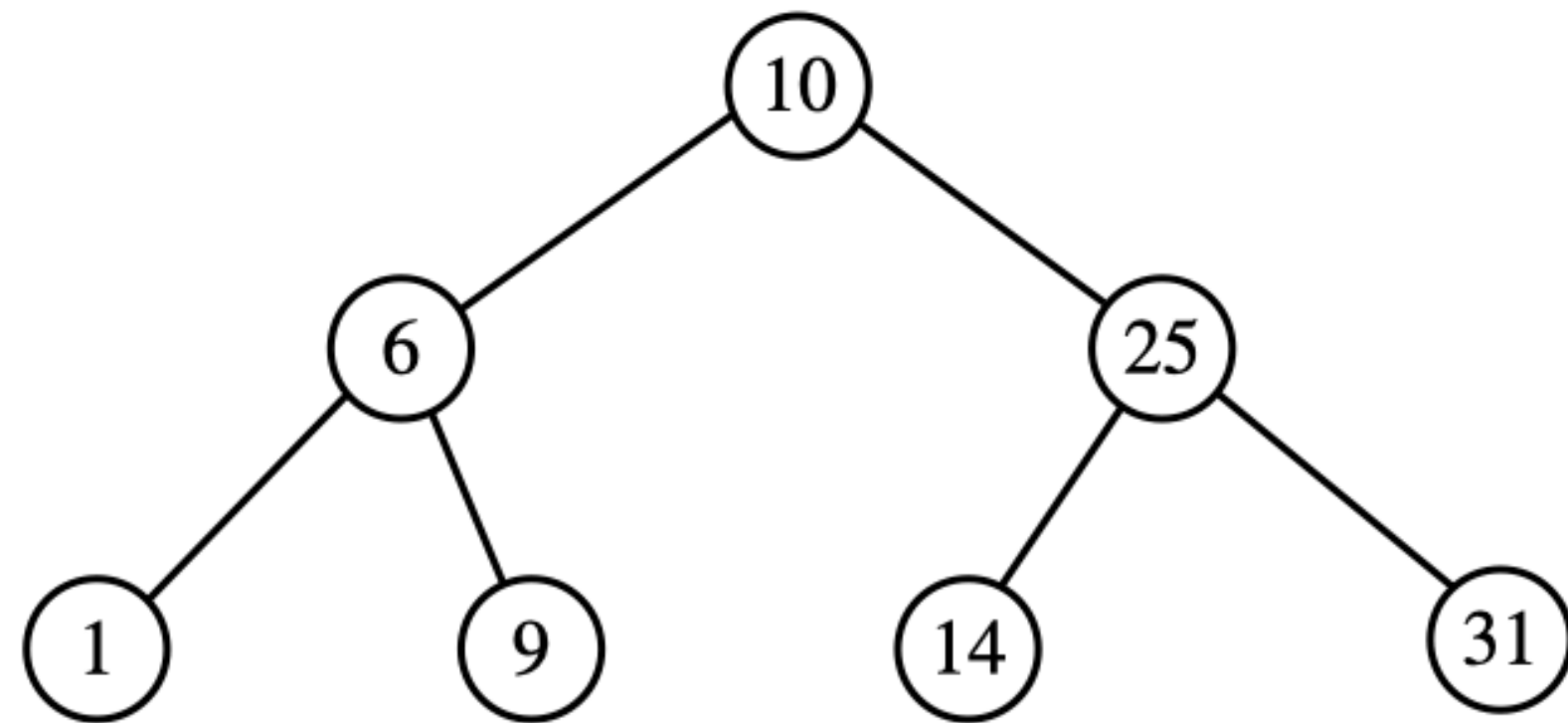
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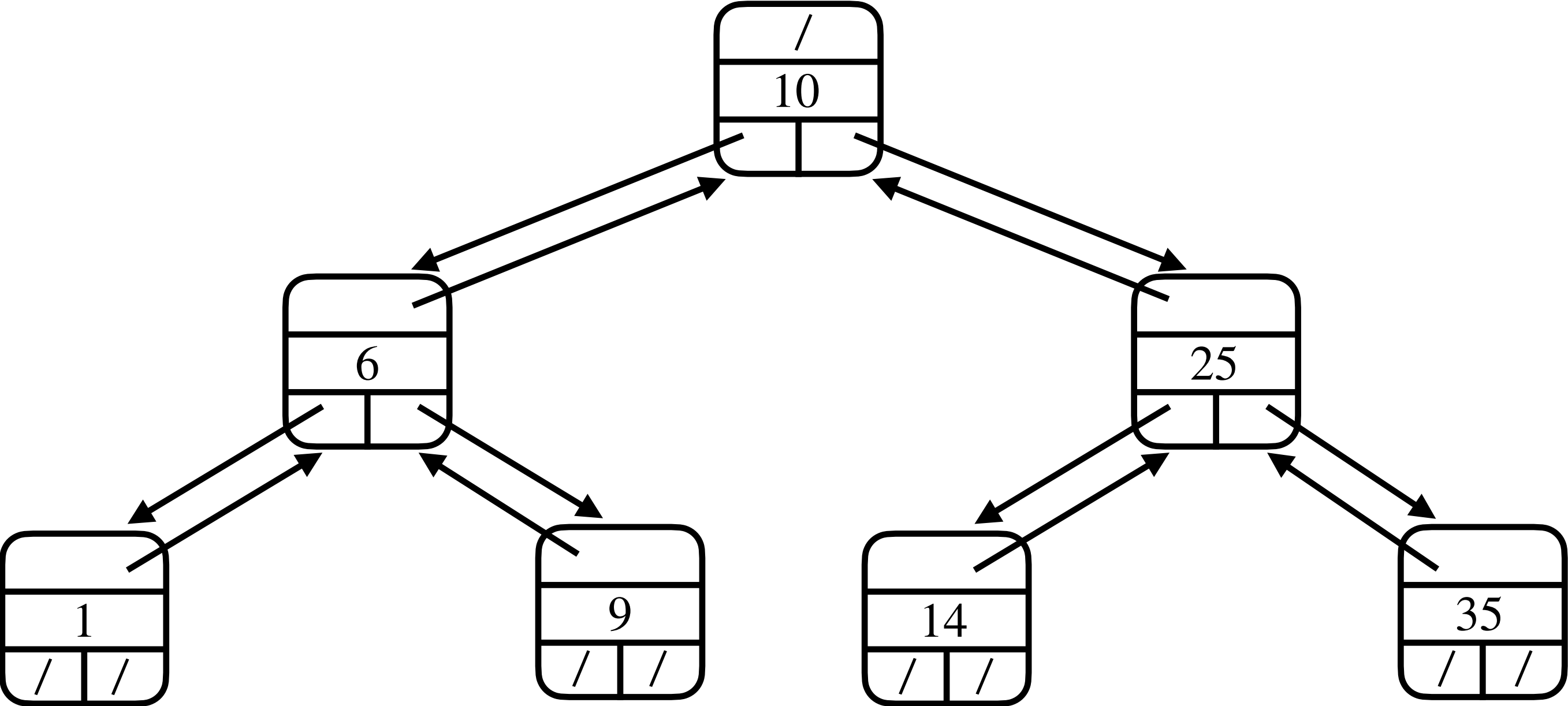
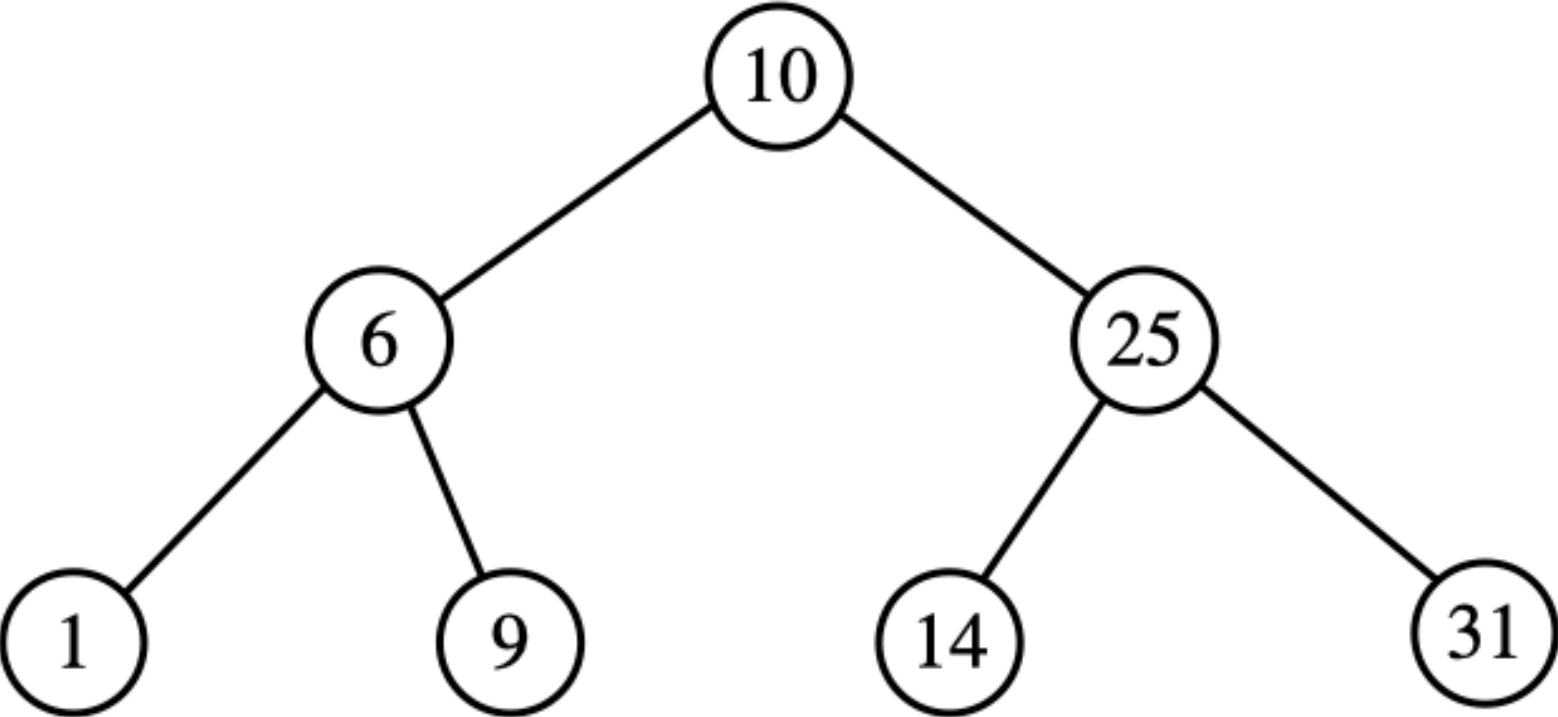
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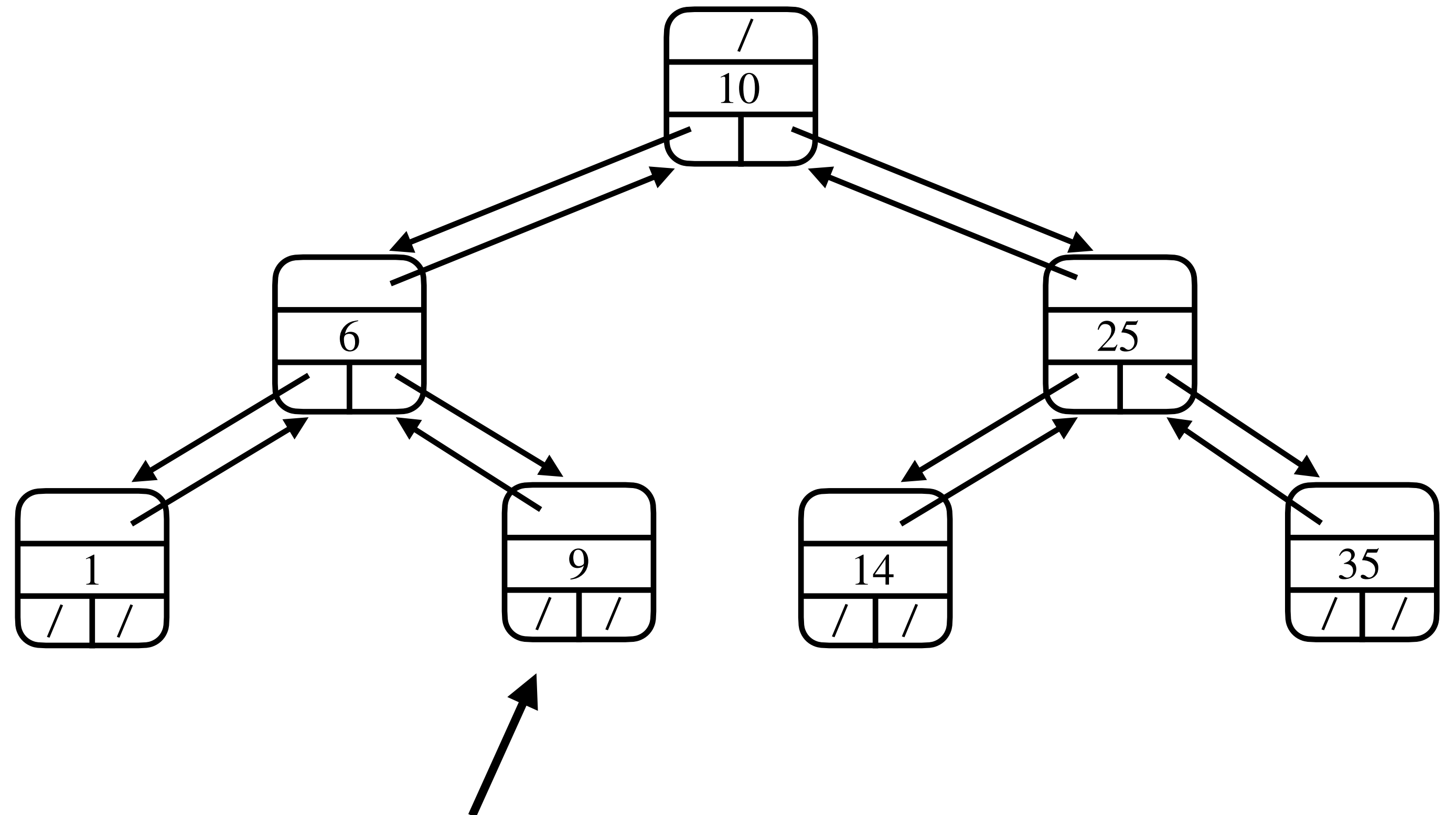
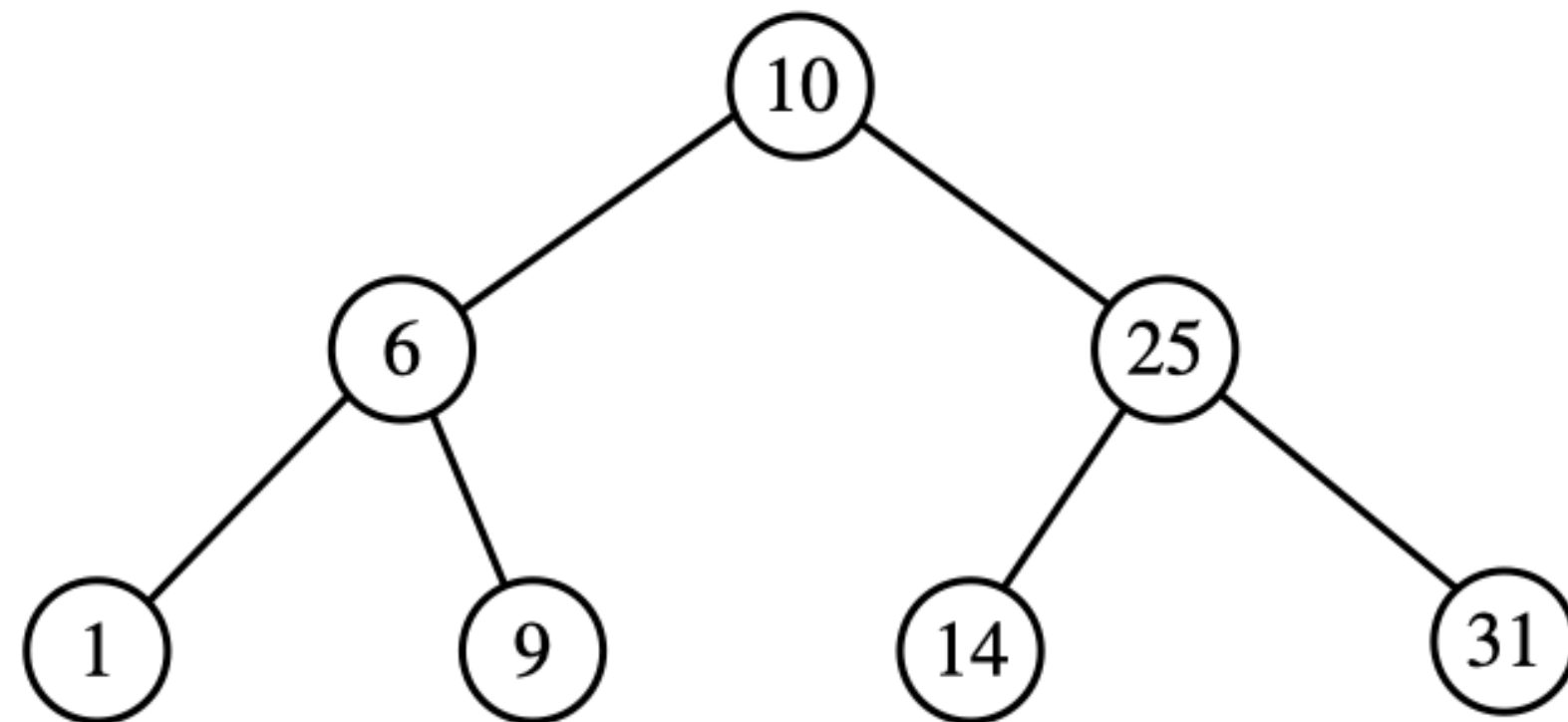
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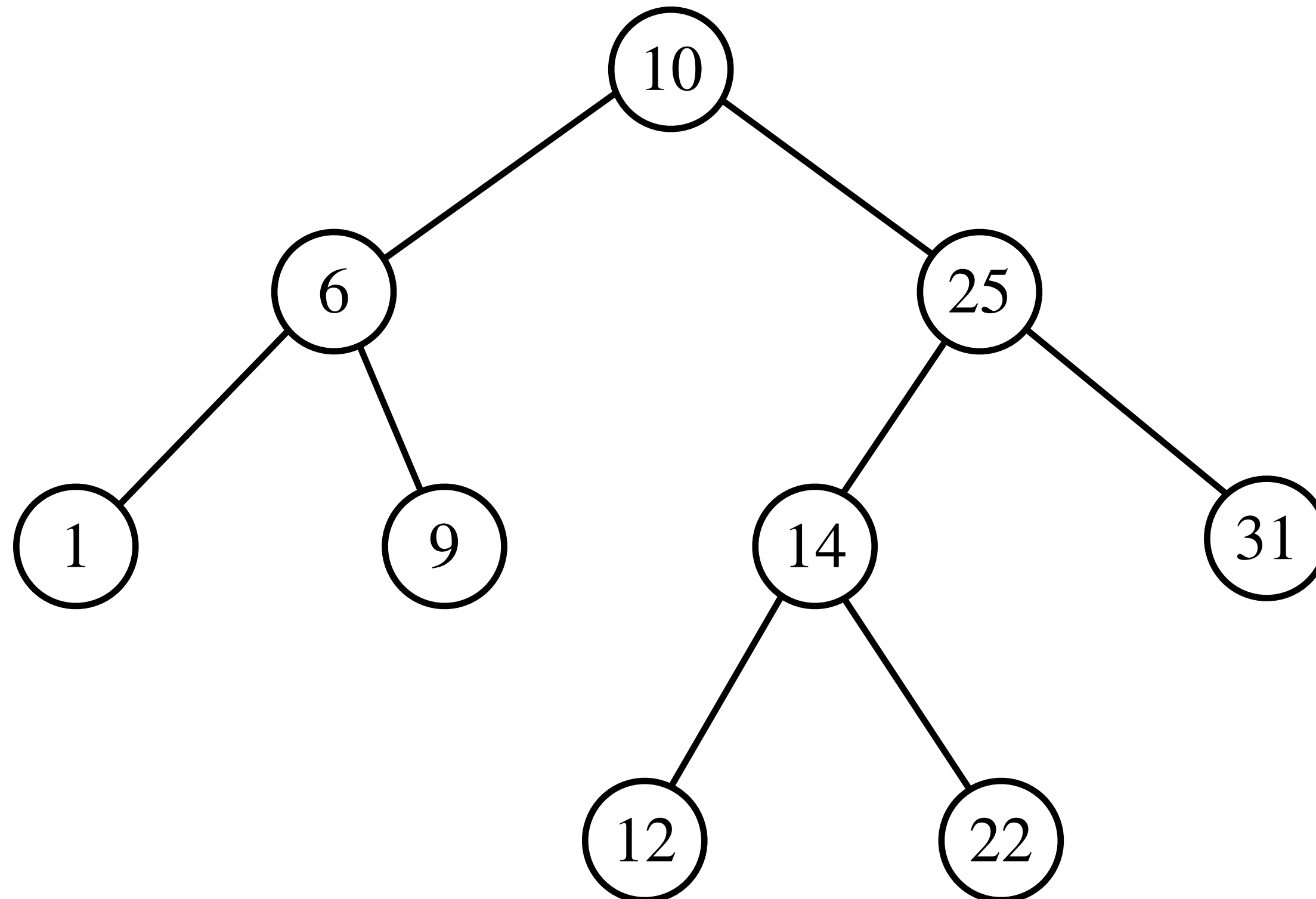
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NIL values in the absence of parent, left or right child.

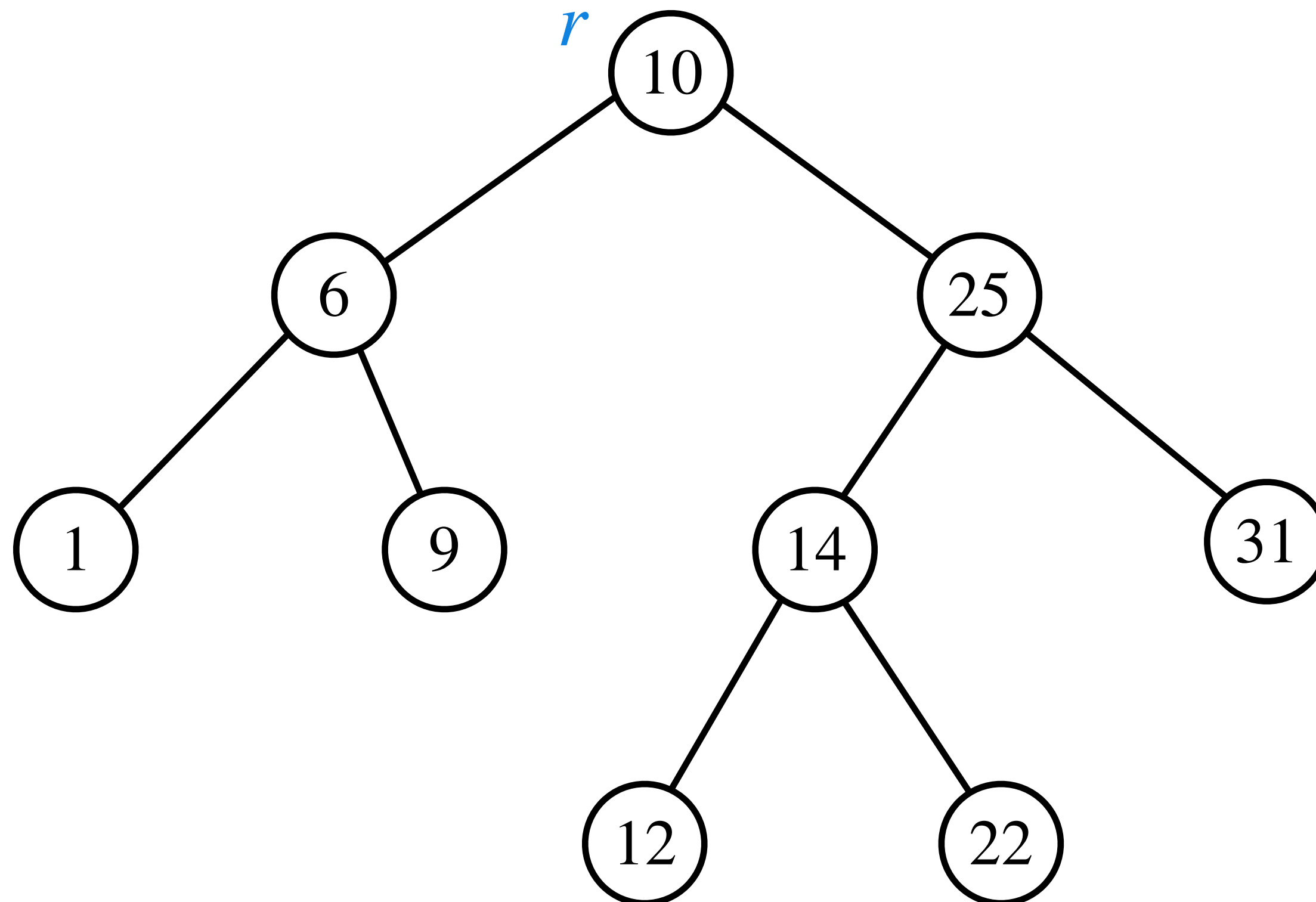
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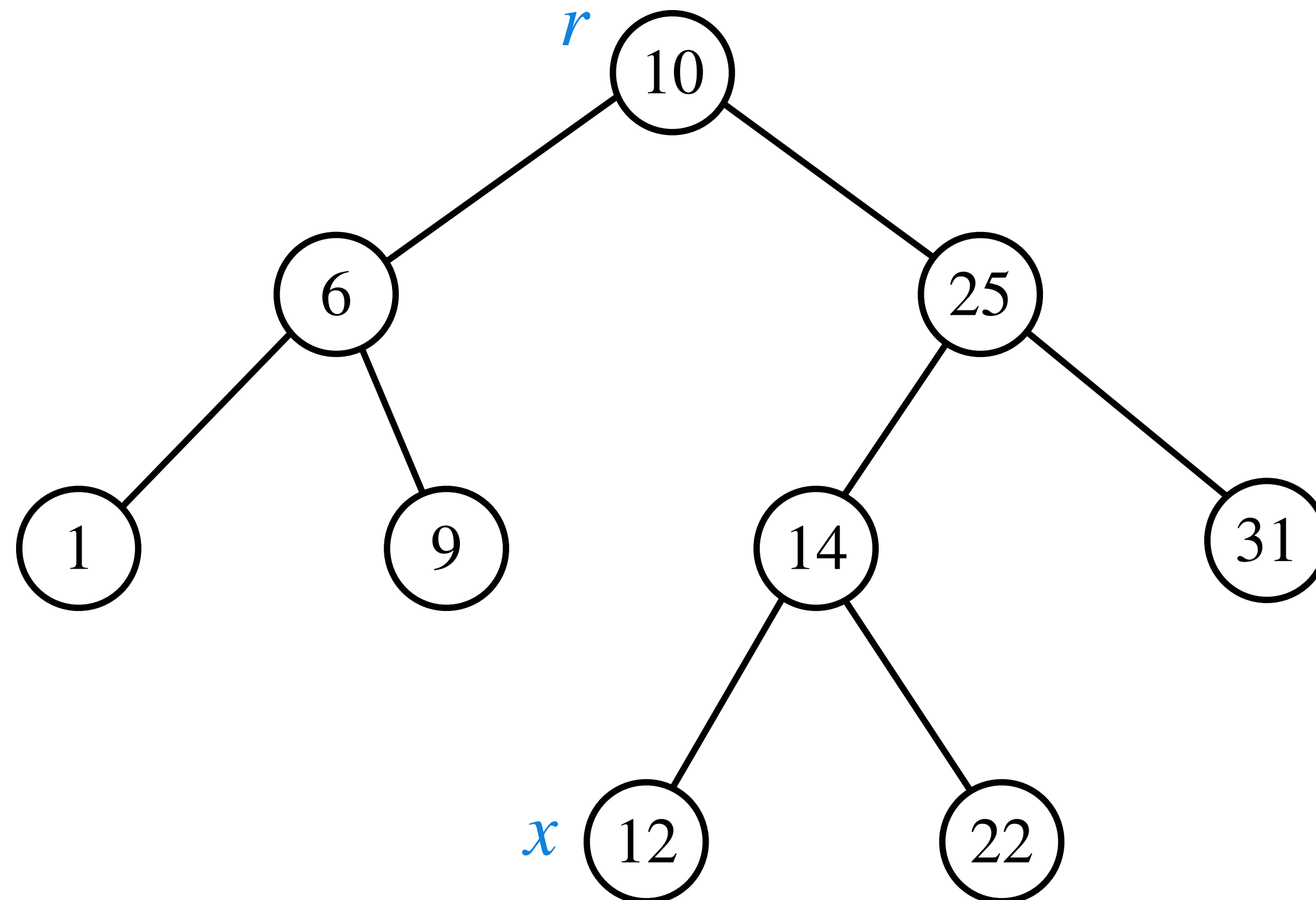




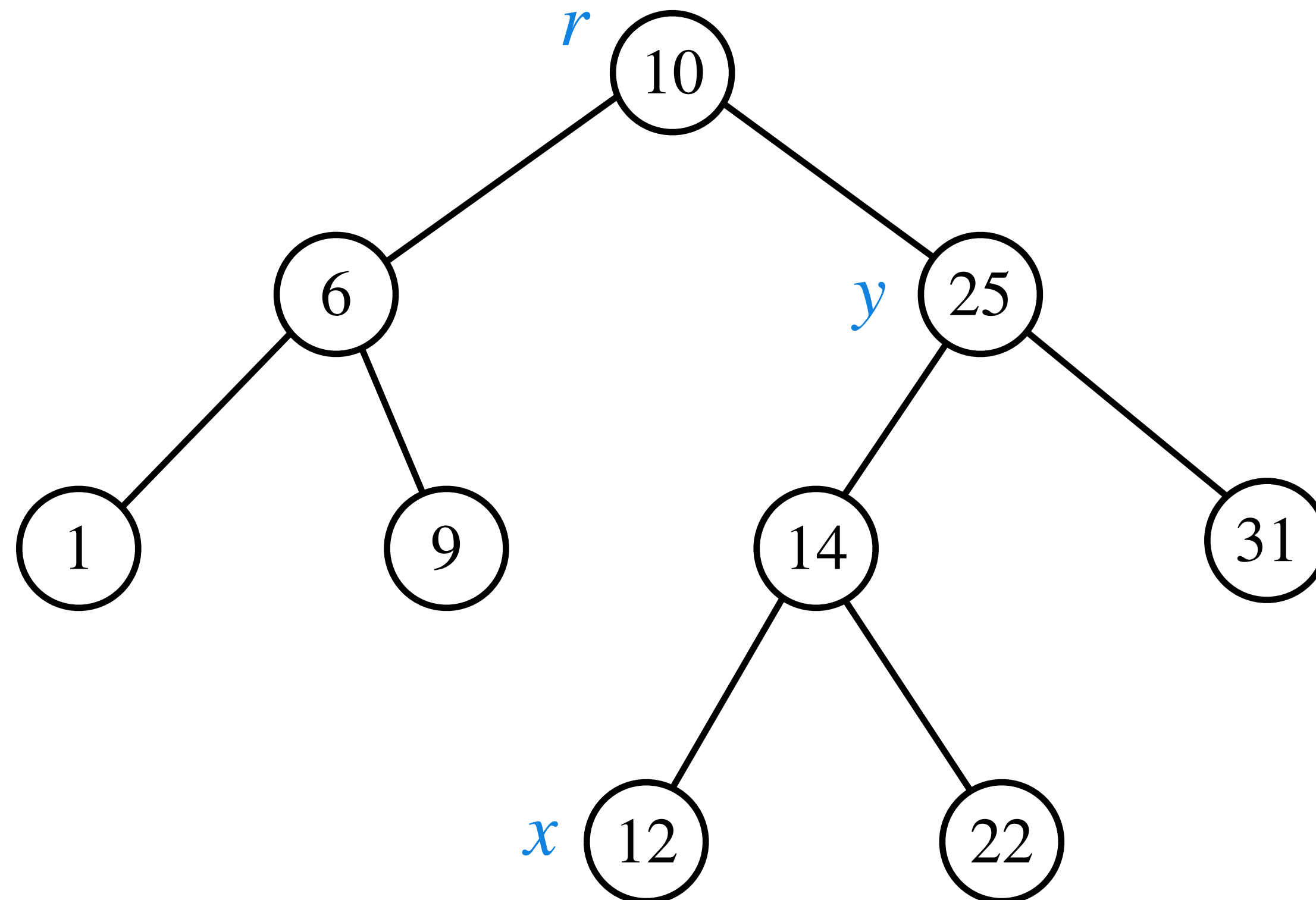
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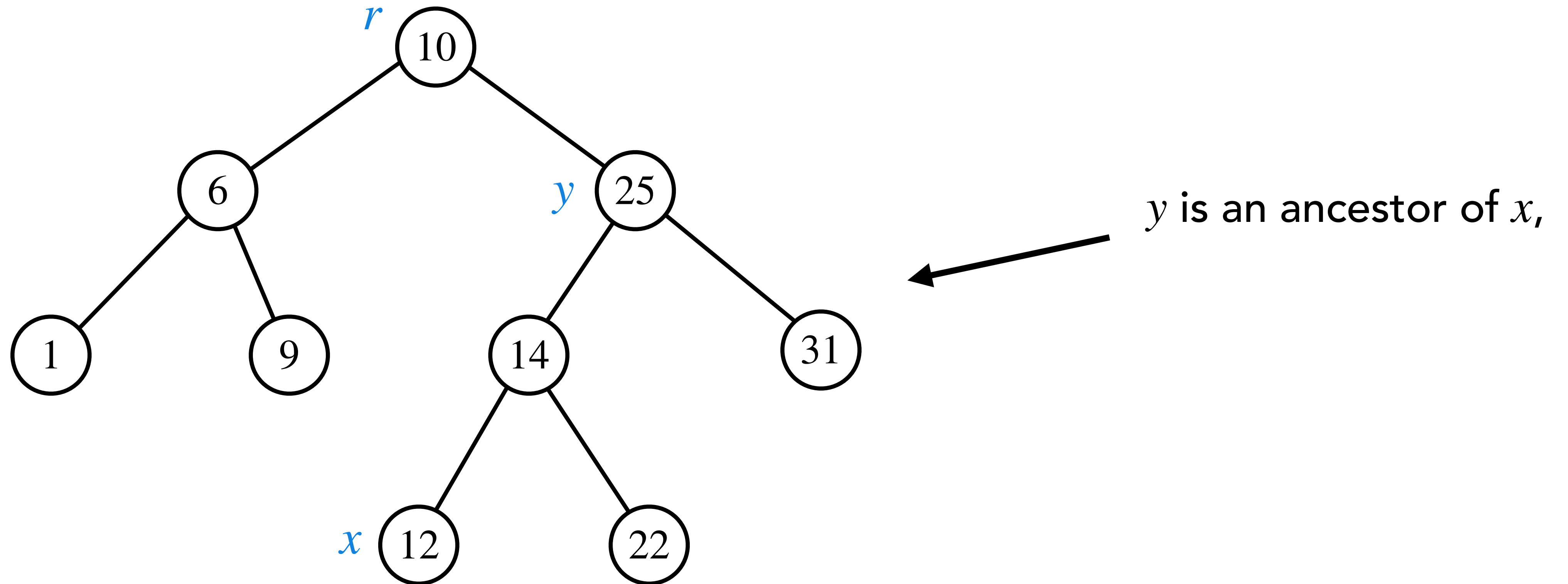
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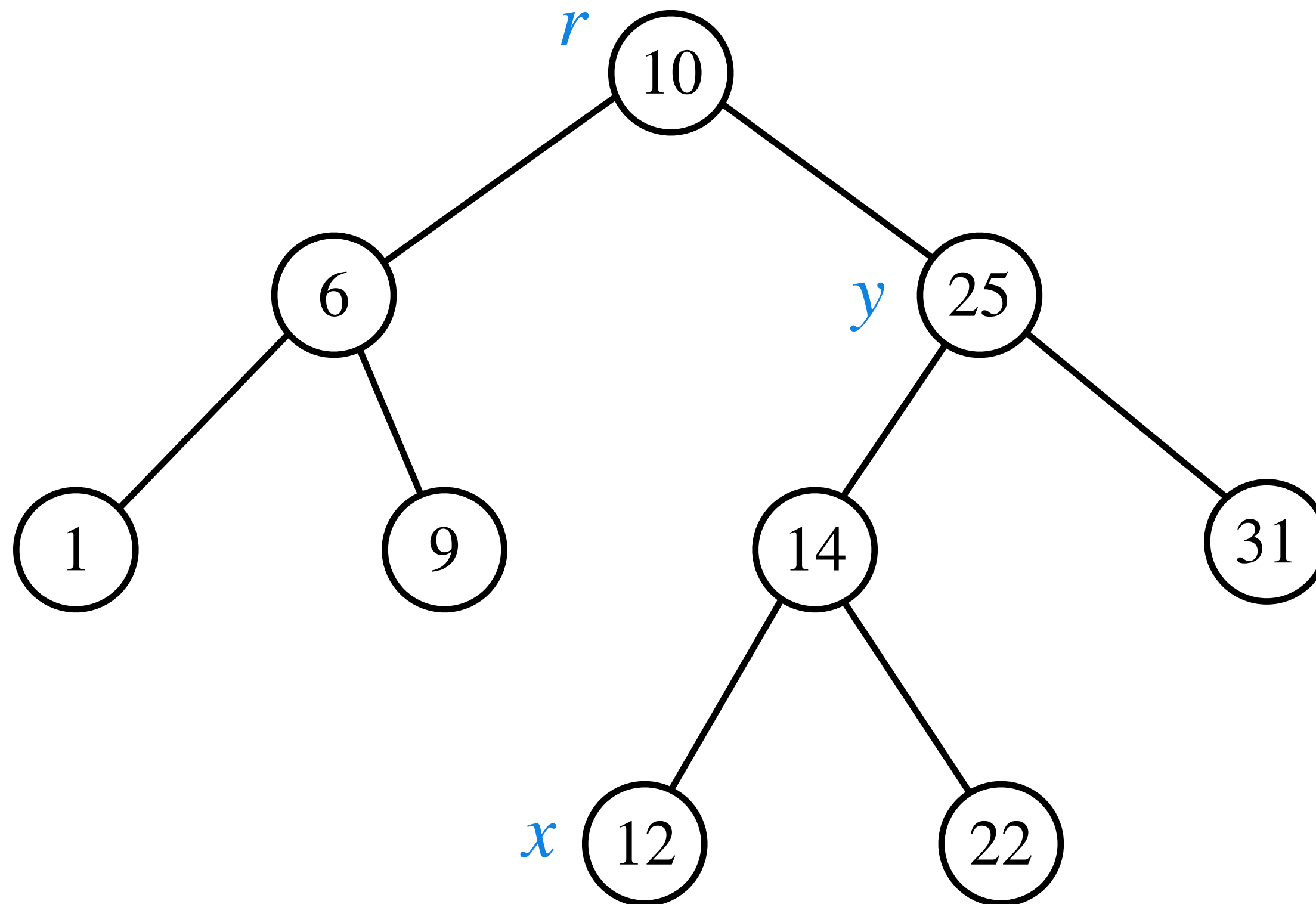
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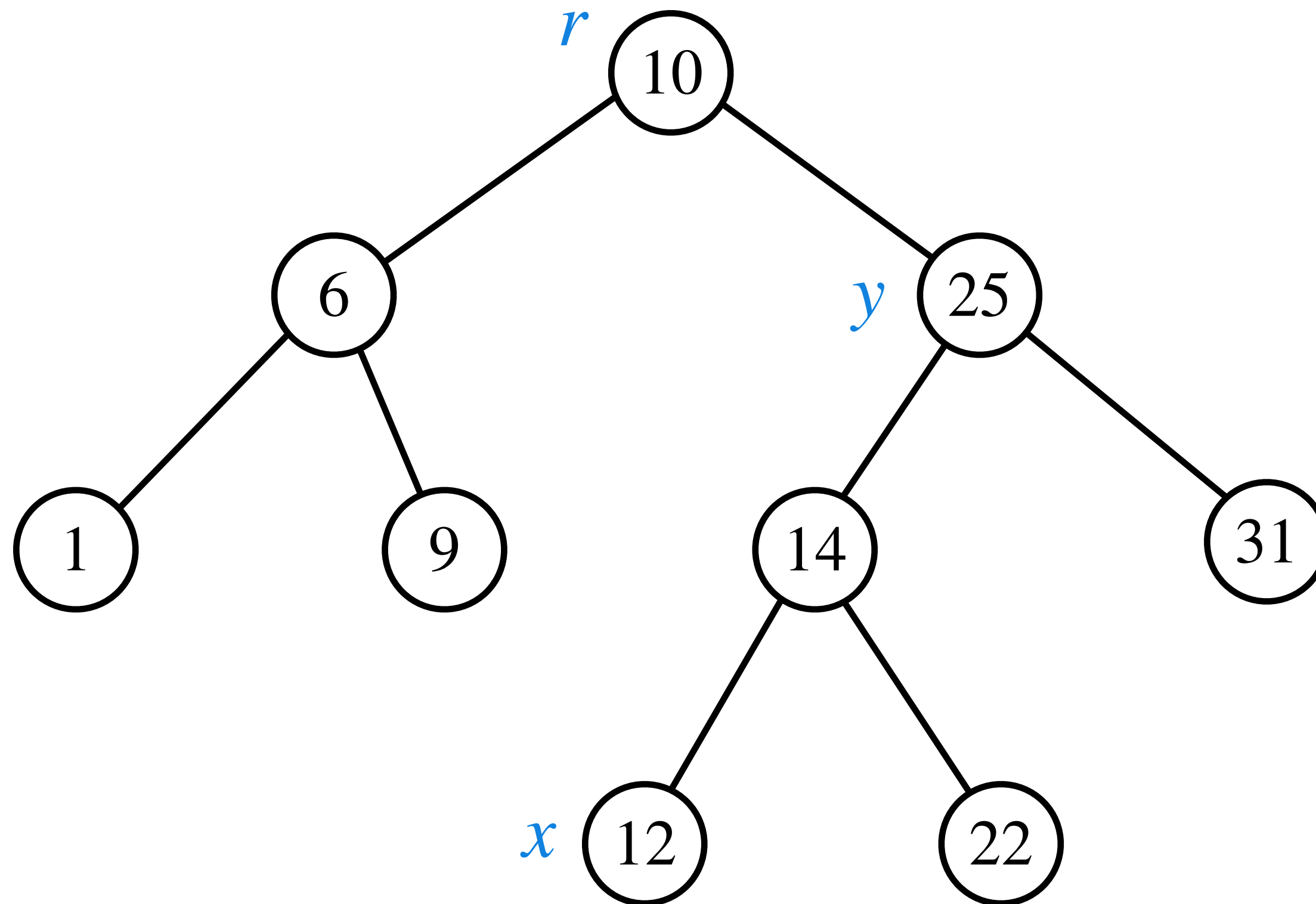


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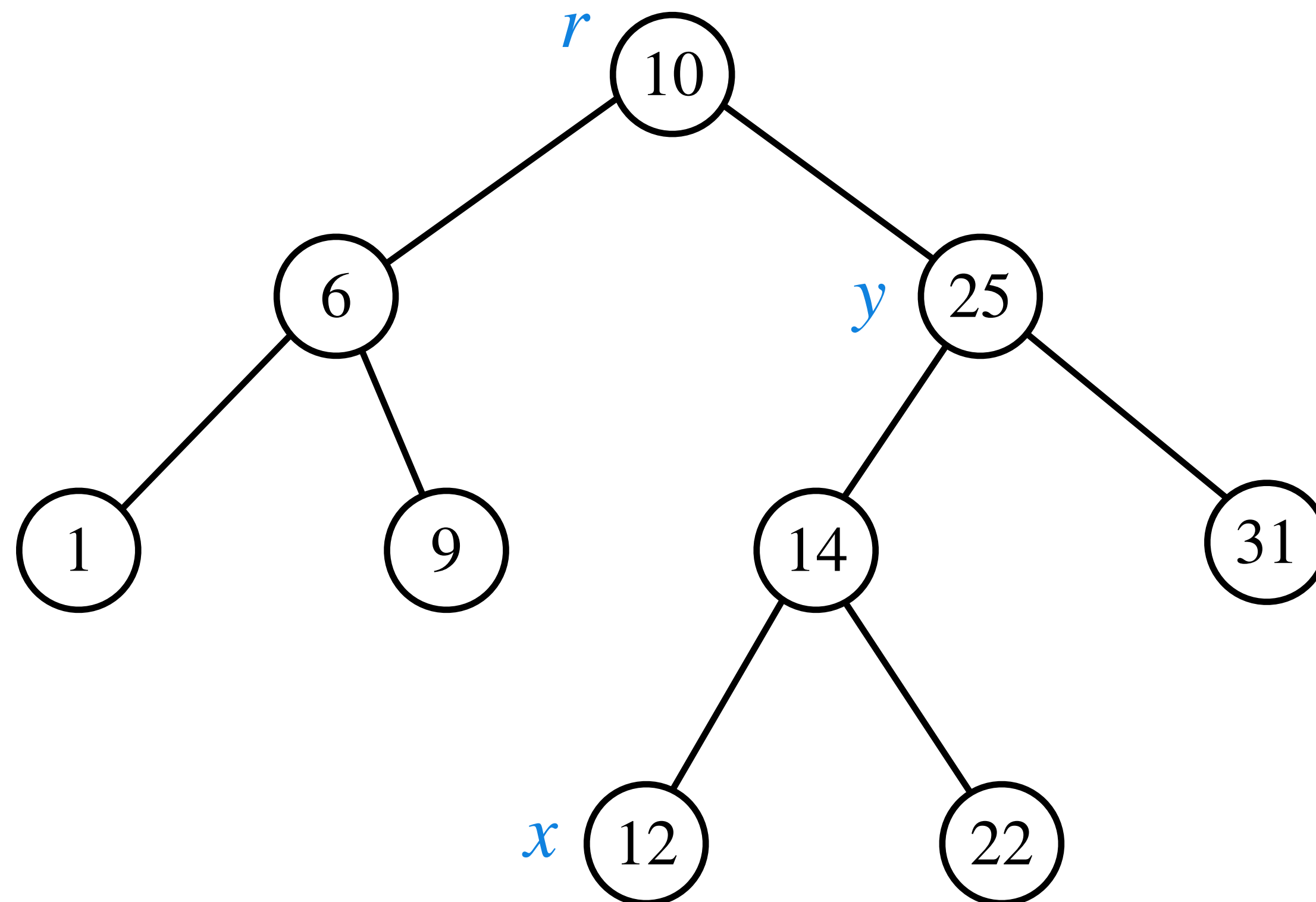
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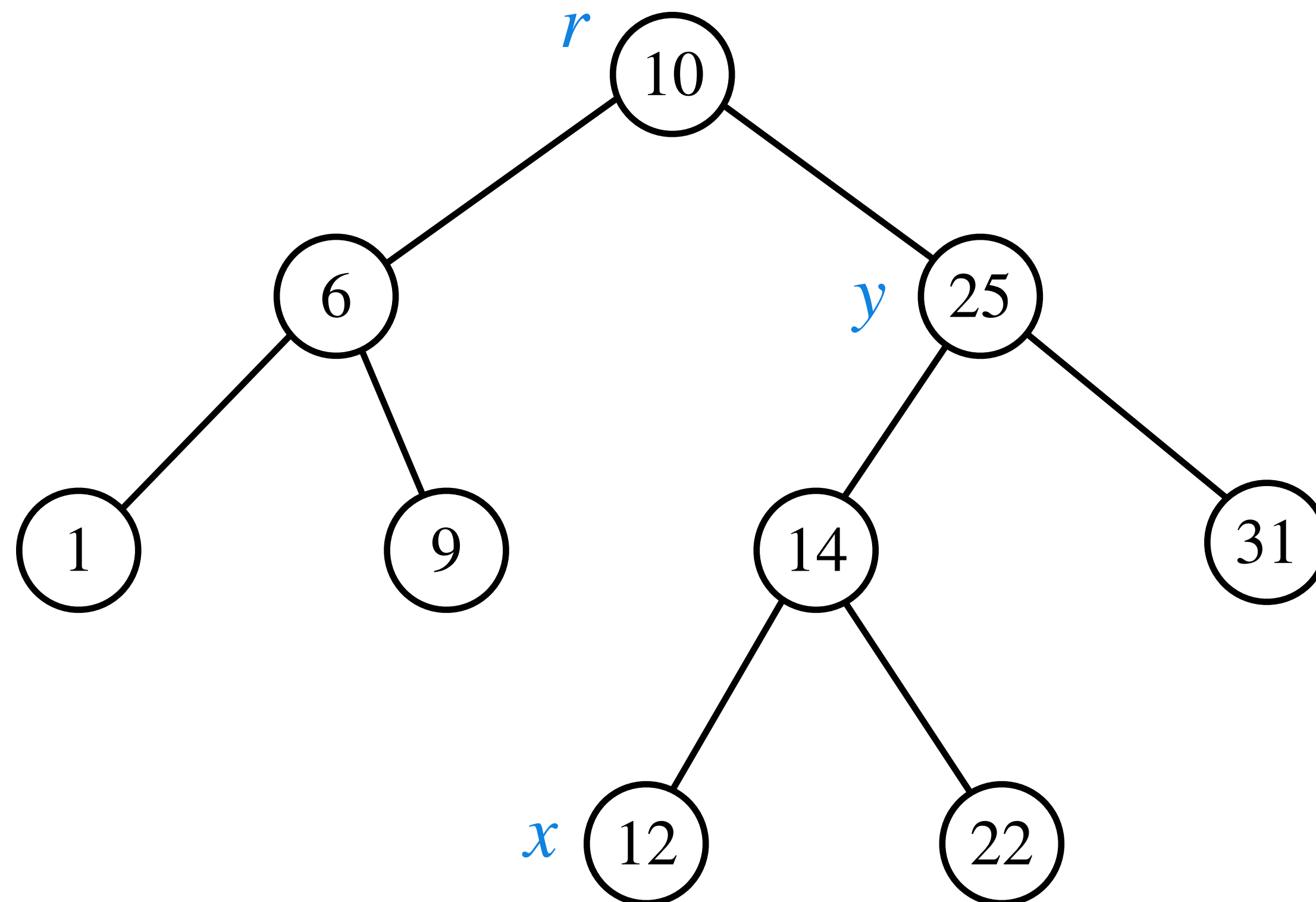
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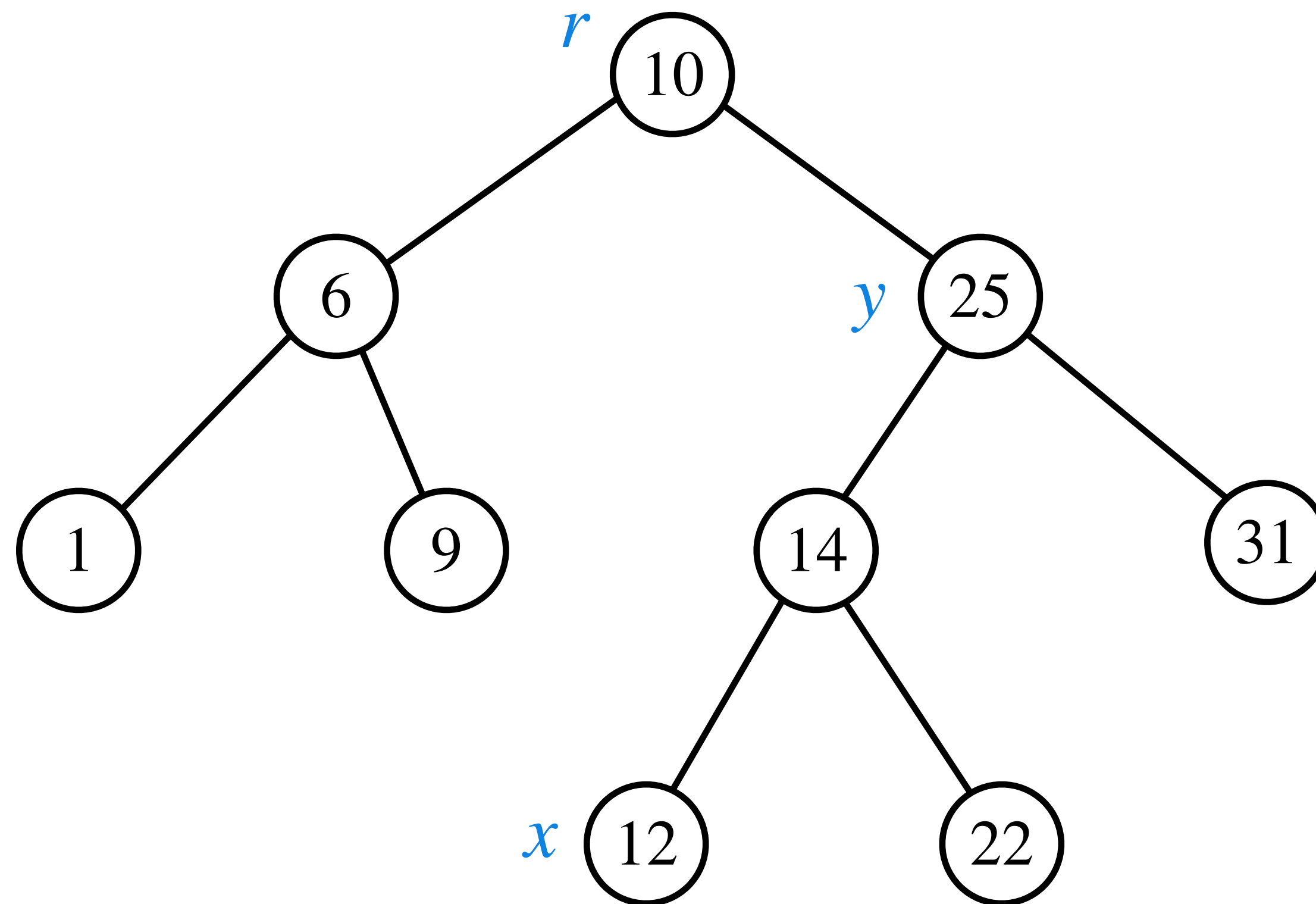


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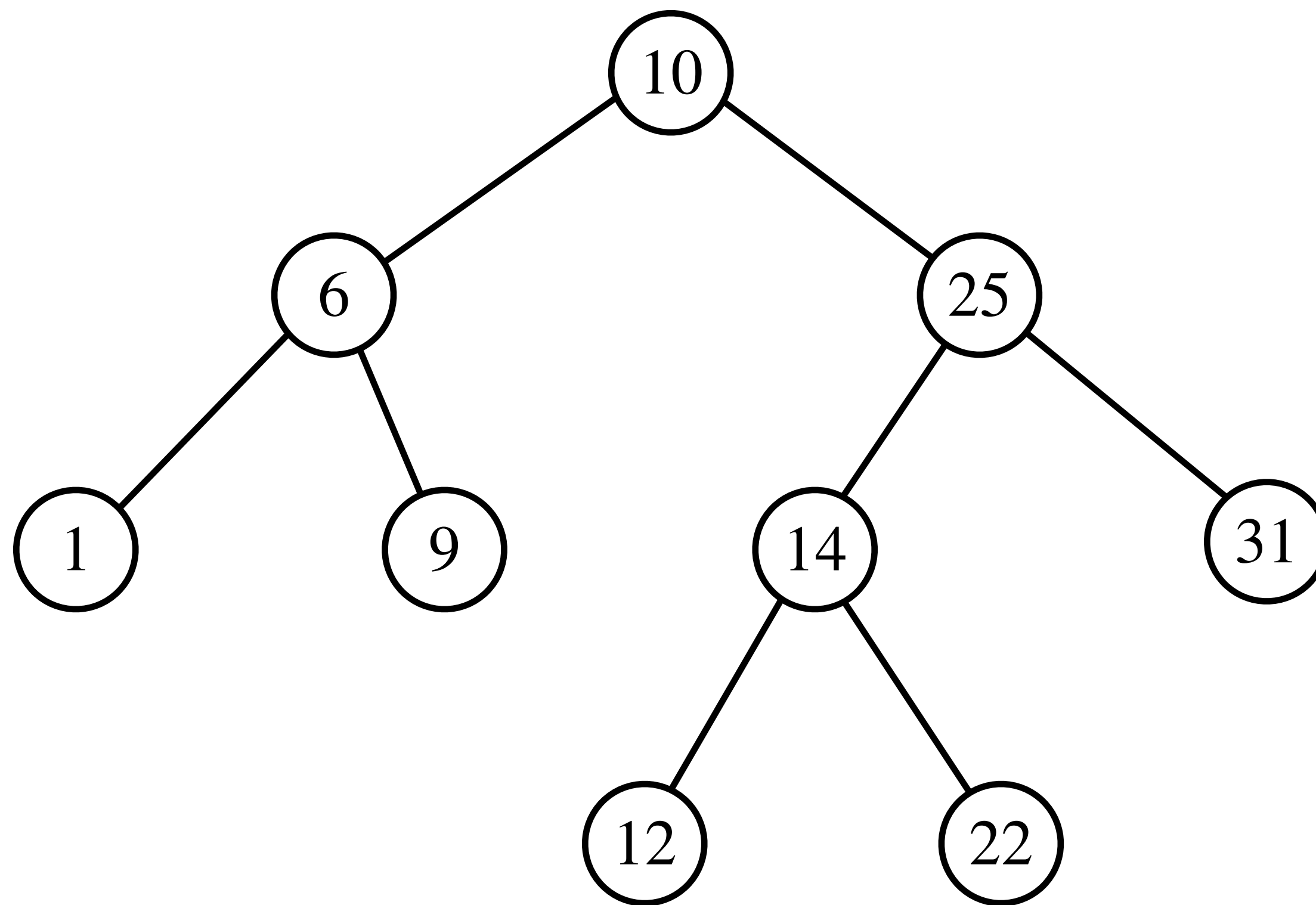
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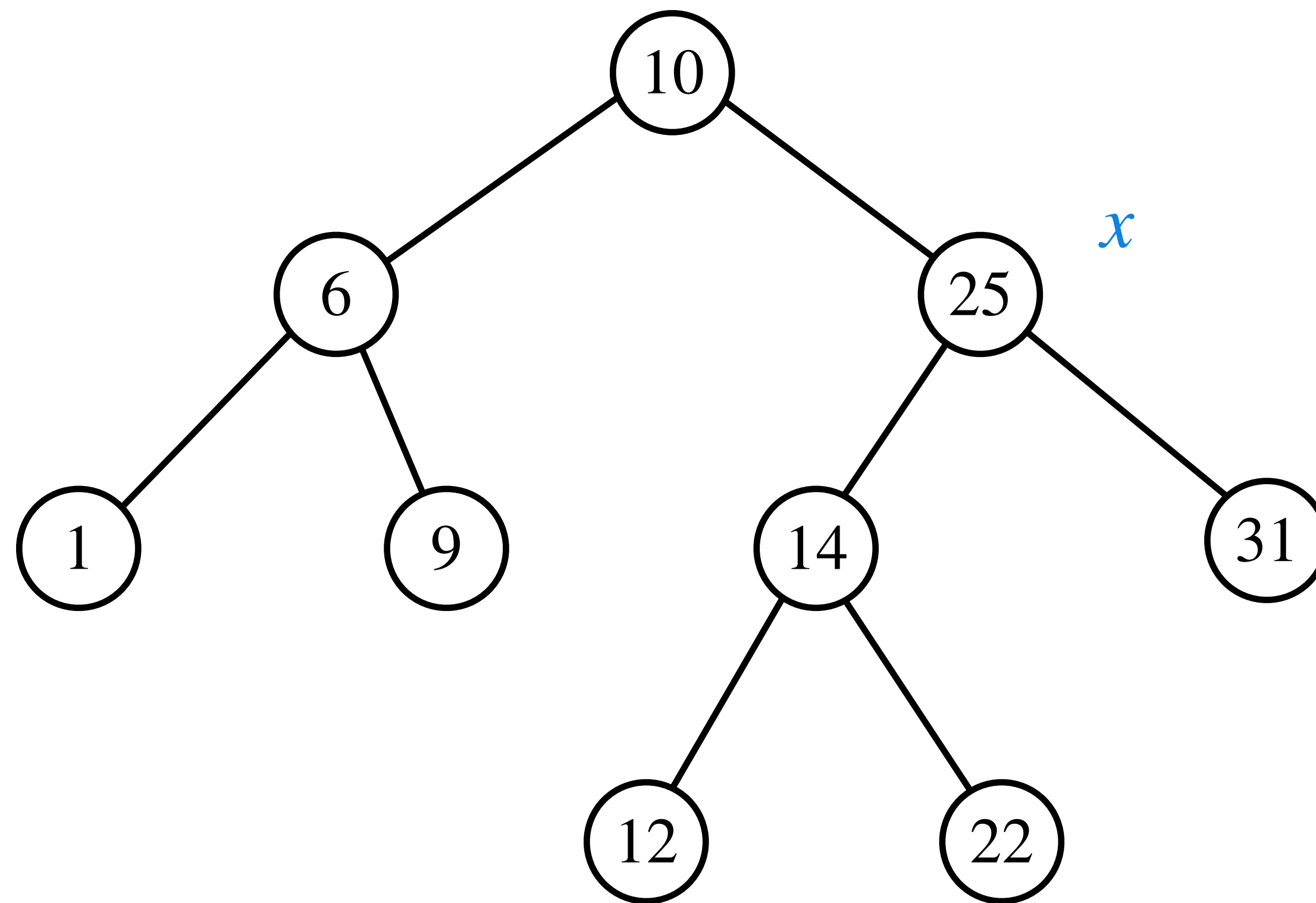
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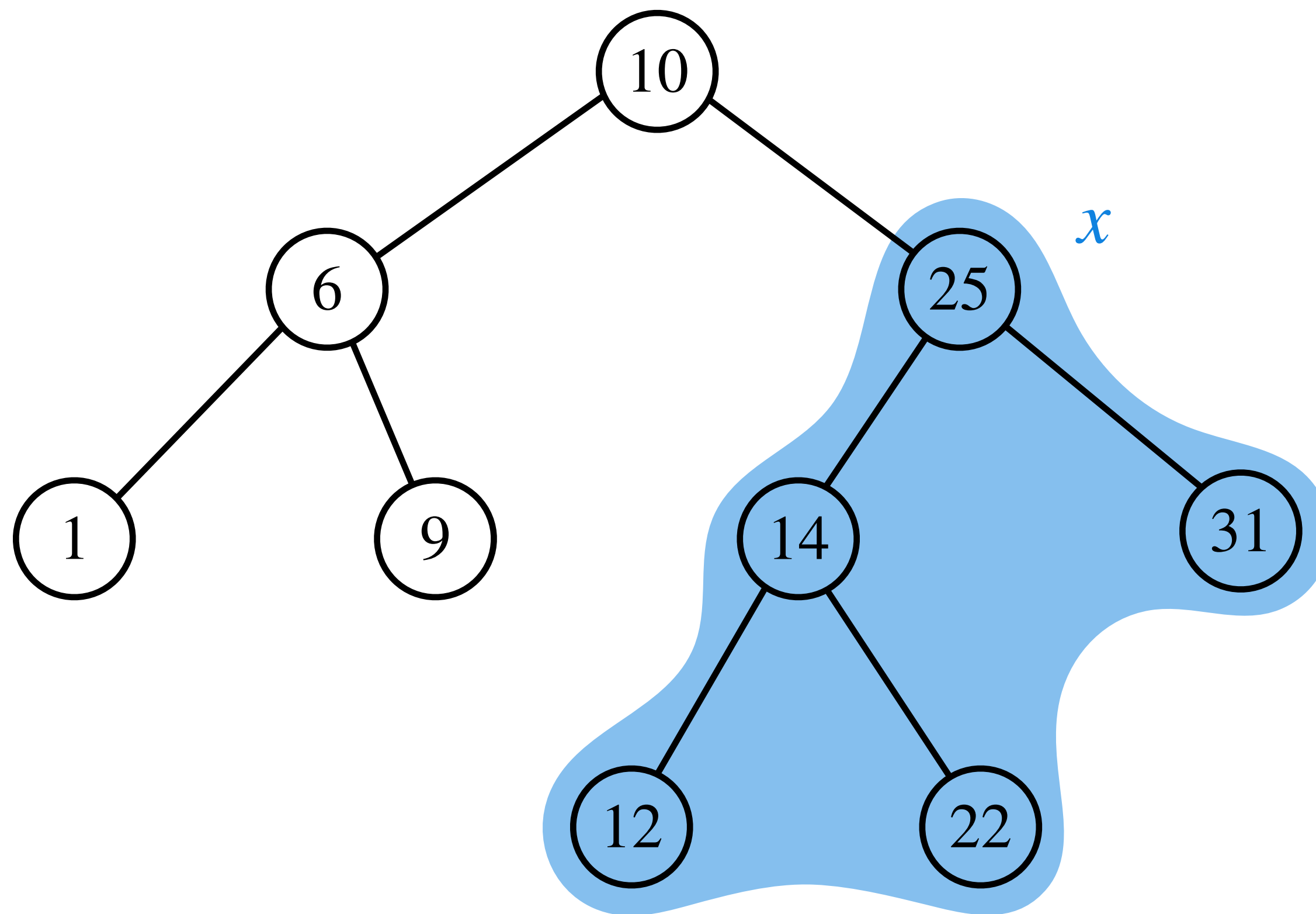
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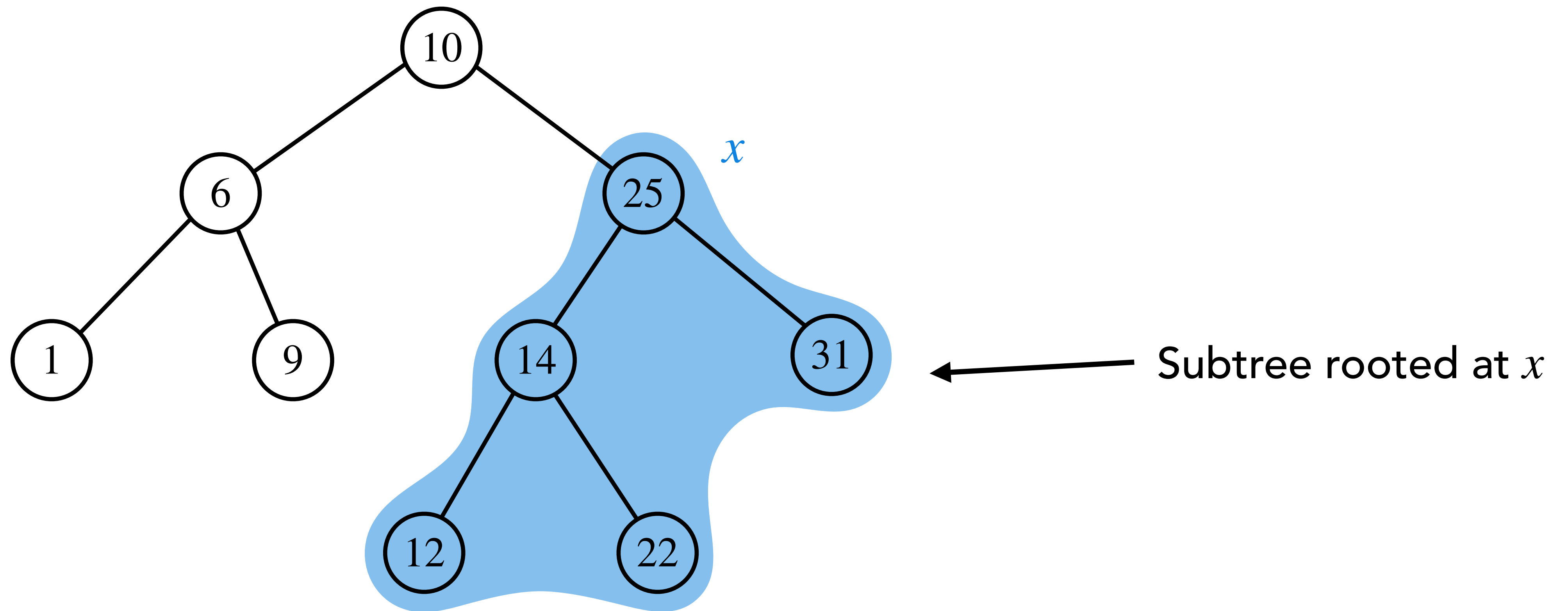
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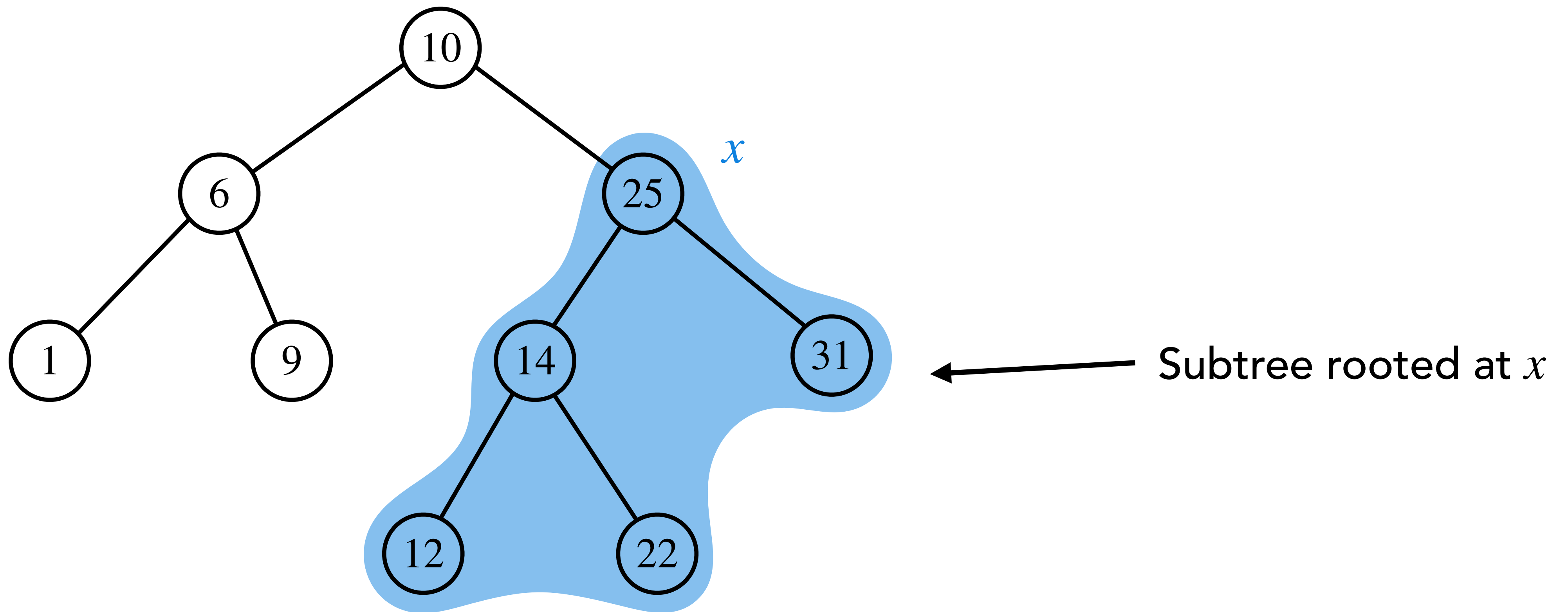


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**Defn:** Subtree rooted at  $x$  is the tree containing only descendants of  $x$ .



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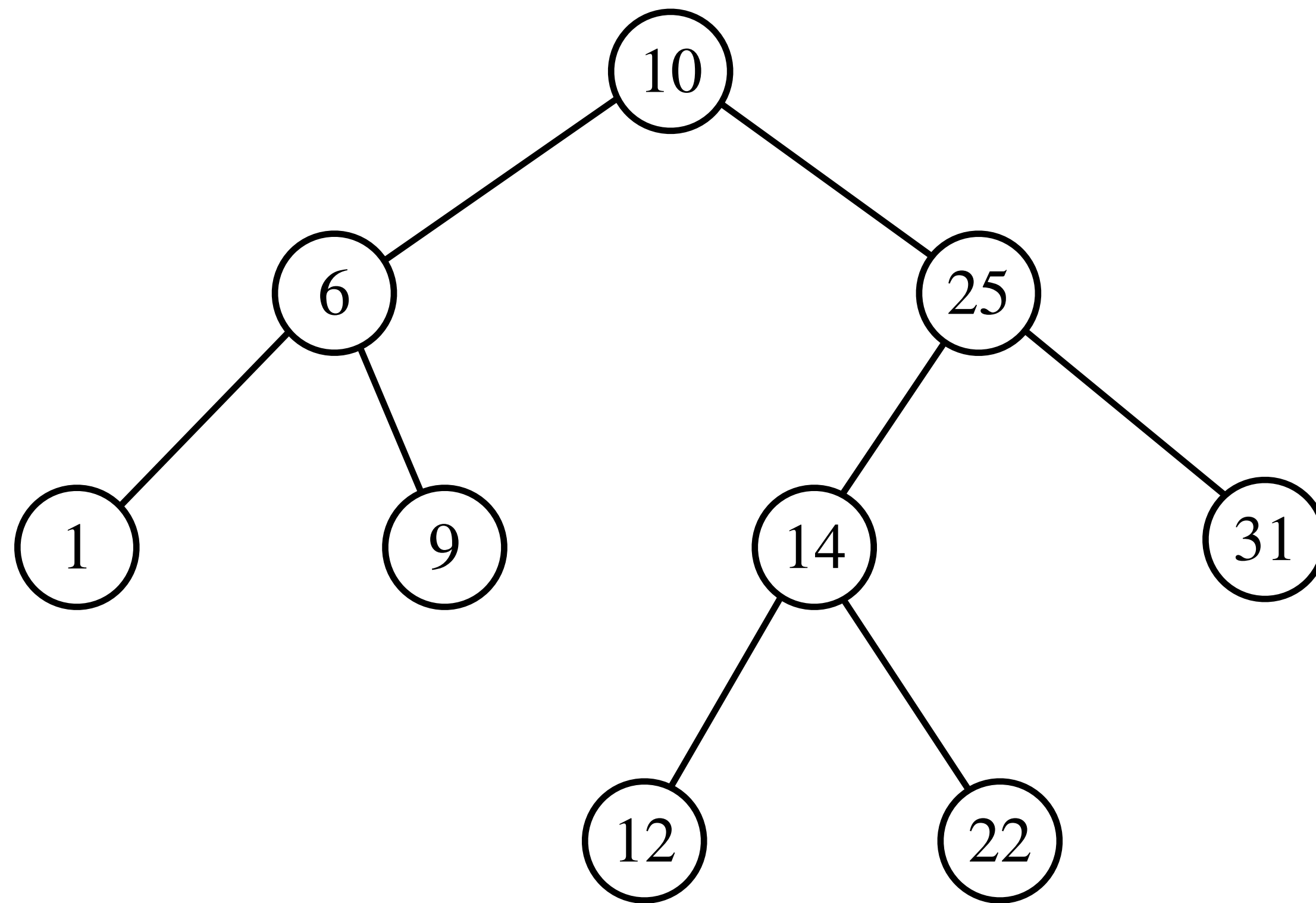


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**Defn:** Two nodes with the same parent are called **siblings**.

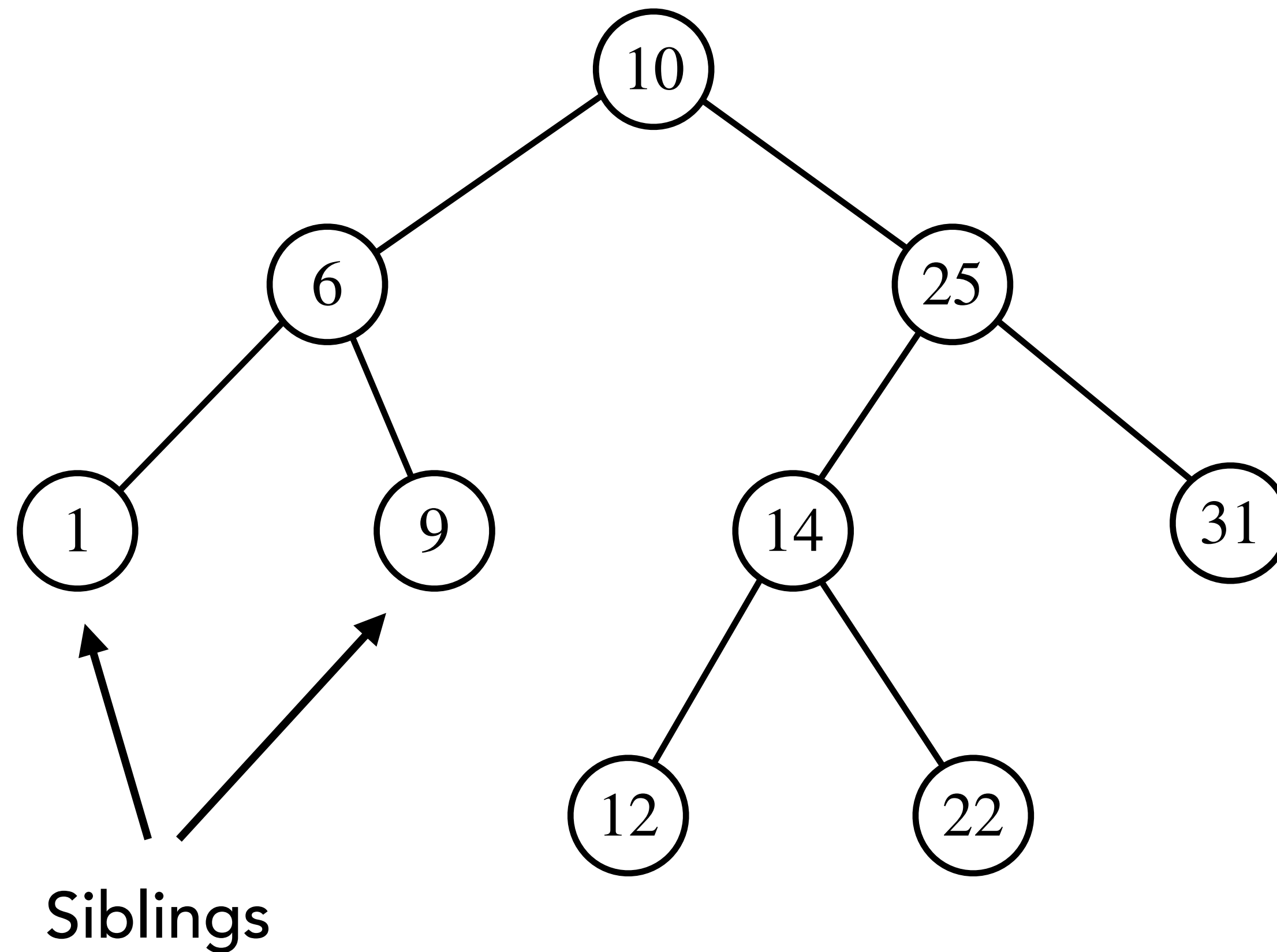
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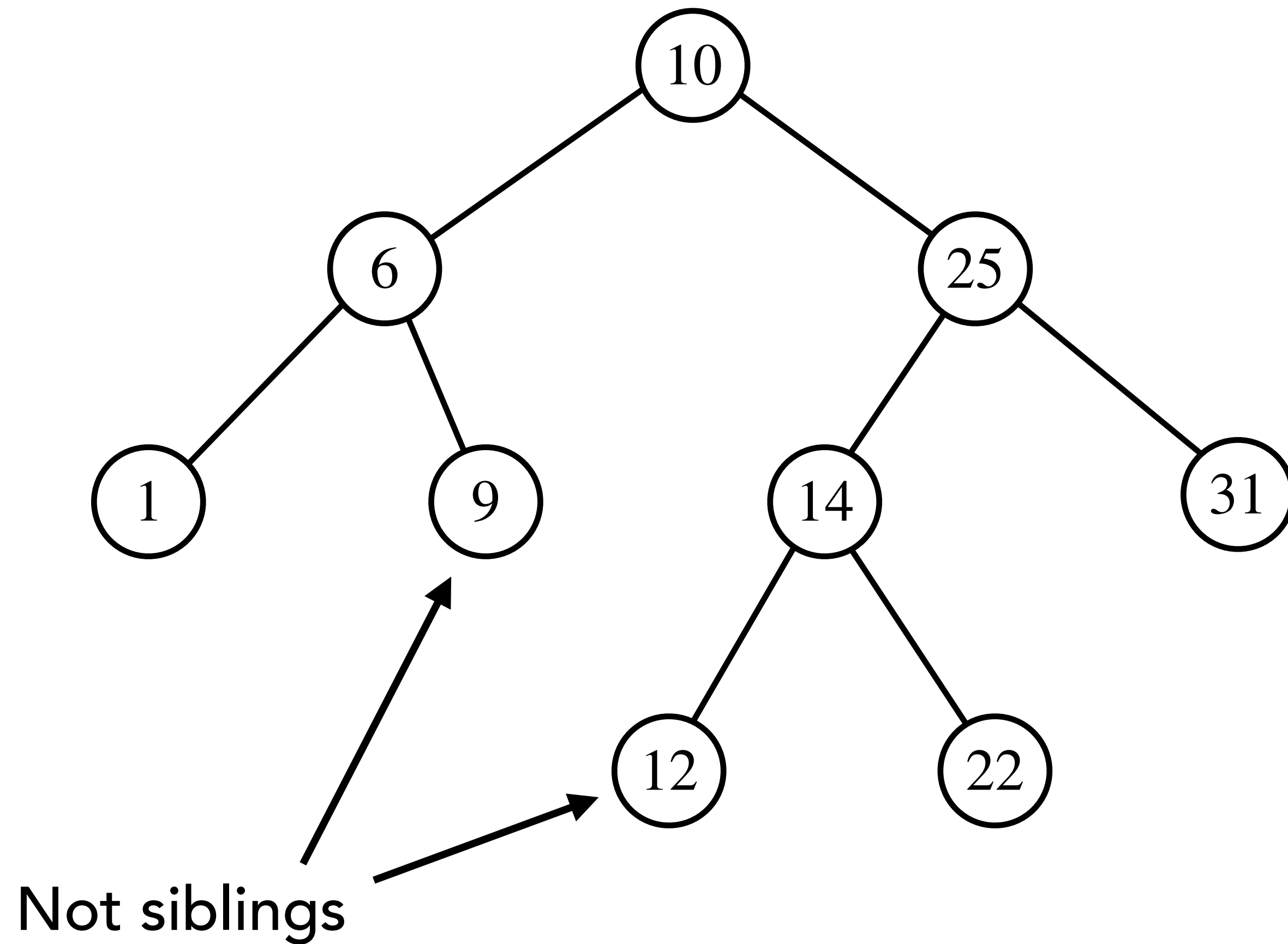
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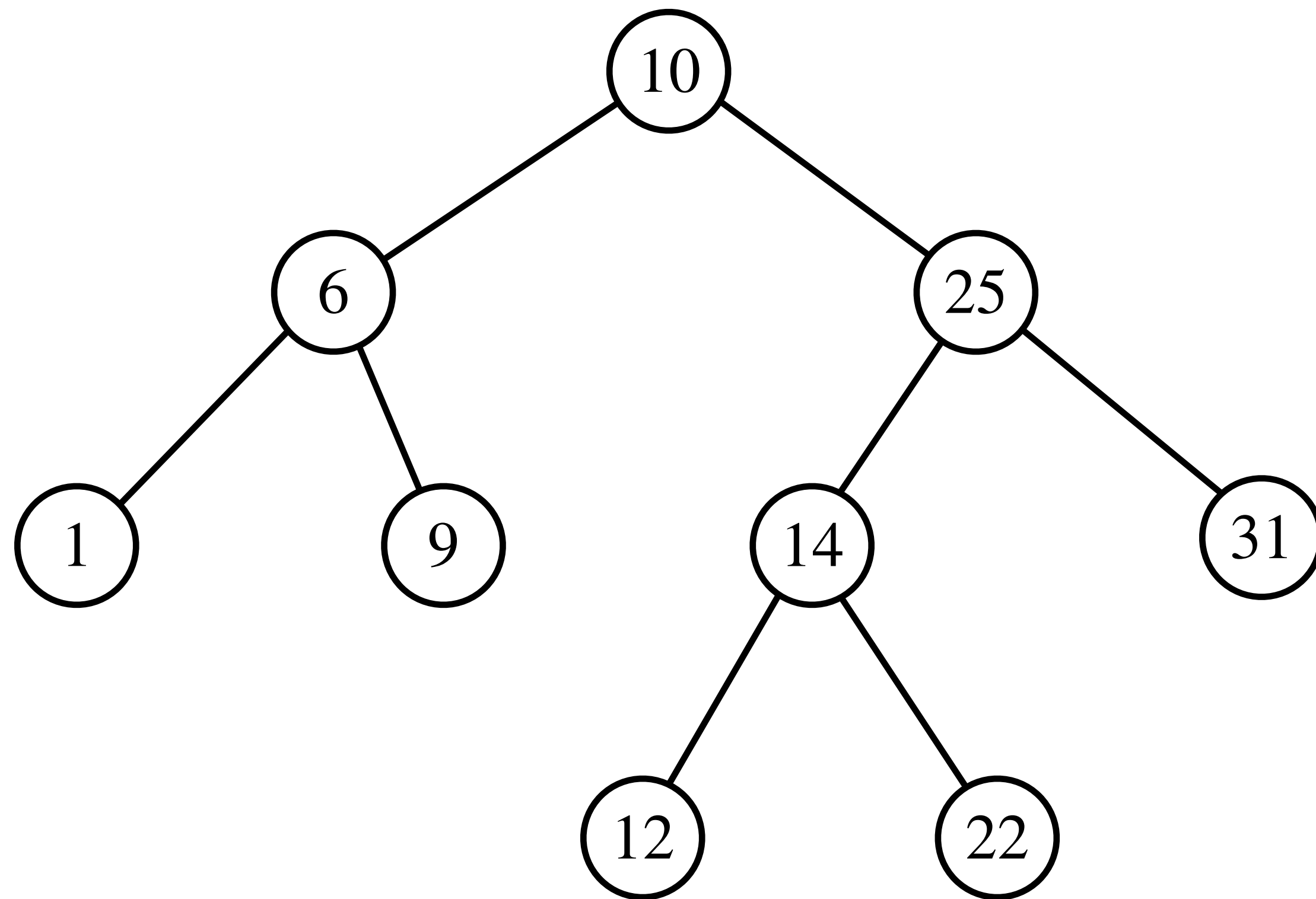
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**Defn:** Nodes with no children are called **leaves**.

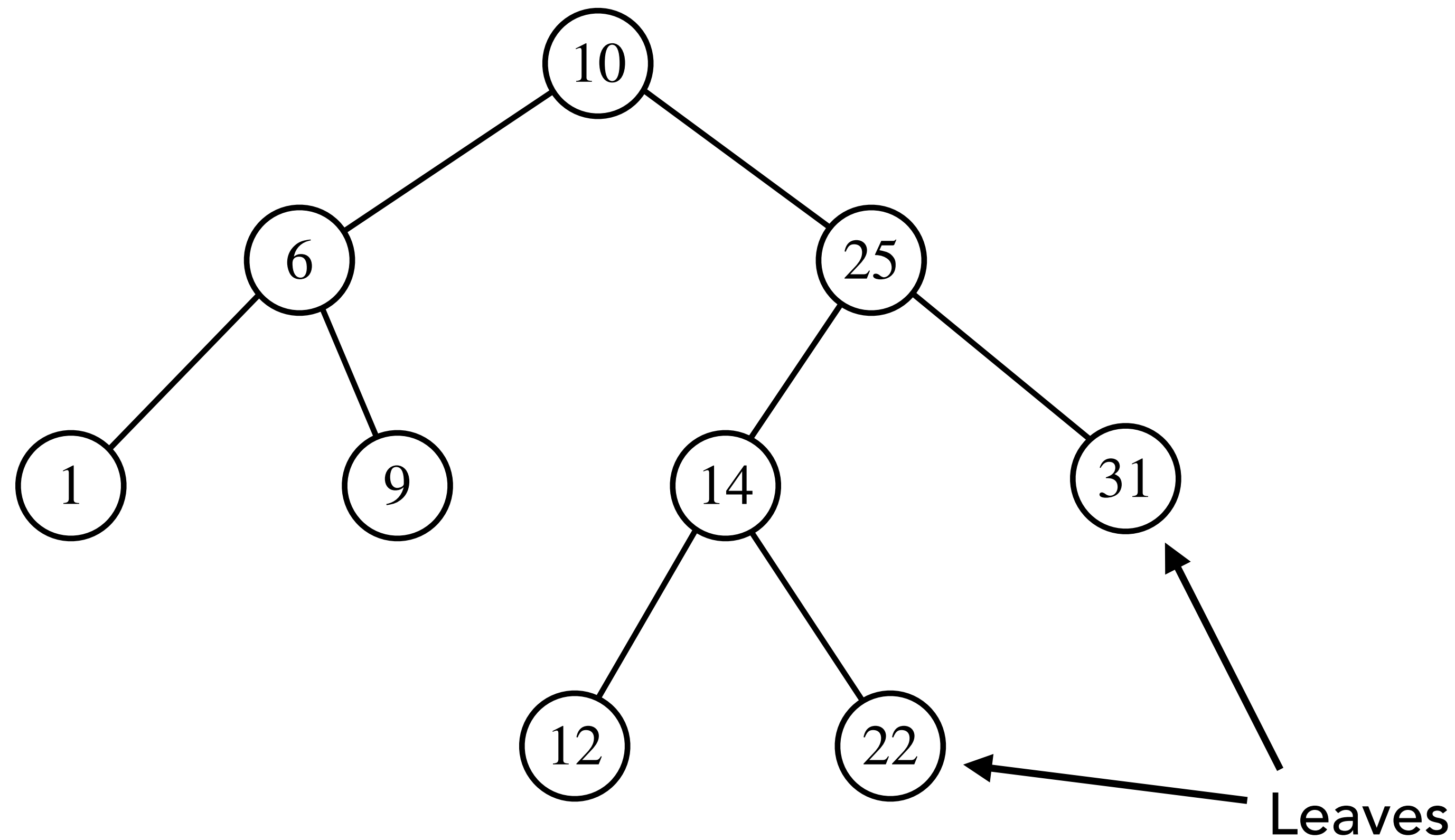
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# **BST: Basic Terminology**

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**Defn:** The **height of a node** in a tree

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**Defn:** The **height of a node** in a tree is the number of edges on the longest downward path

# BST: Basic Terminology

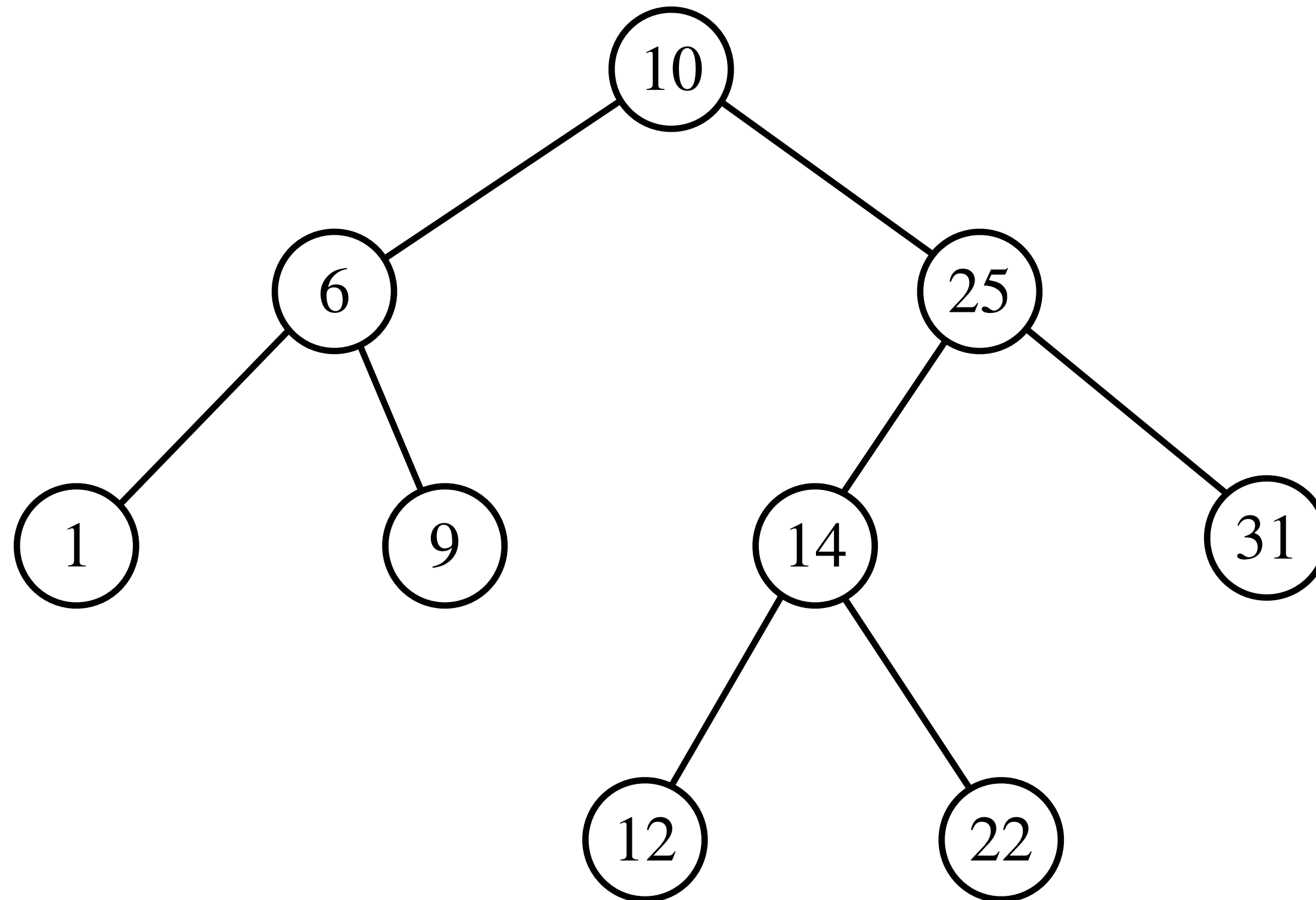
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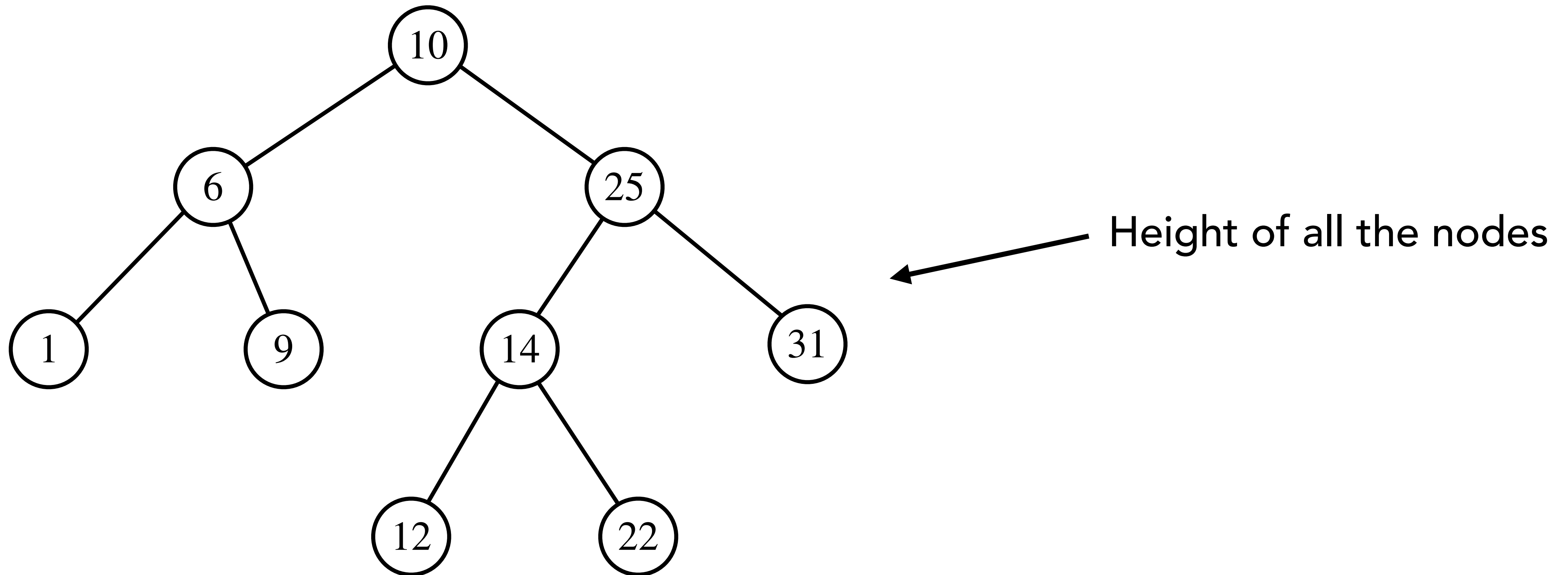
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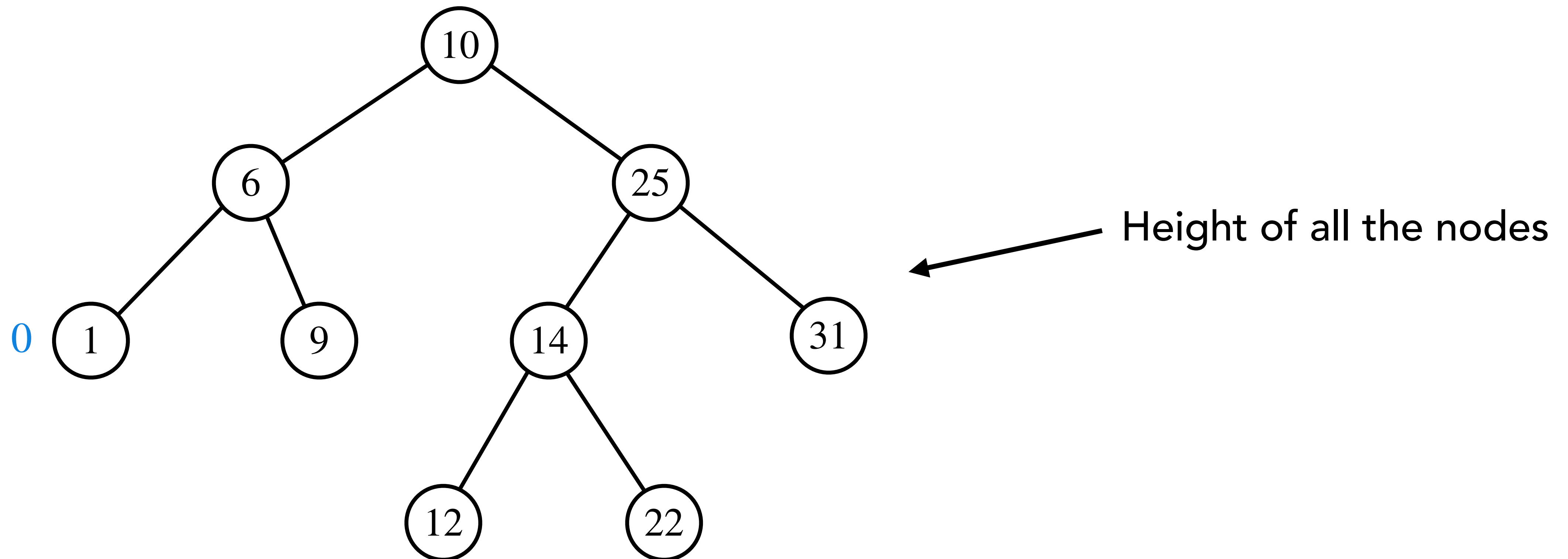
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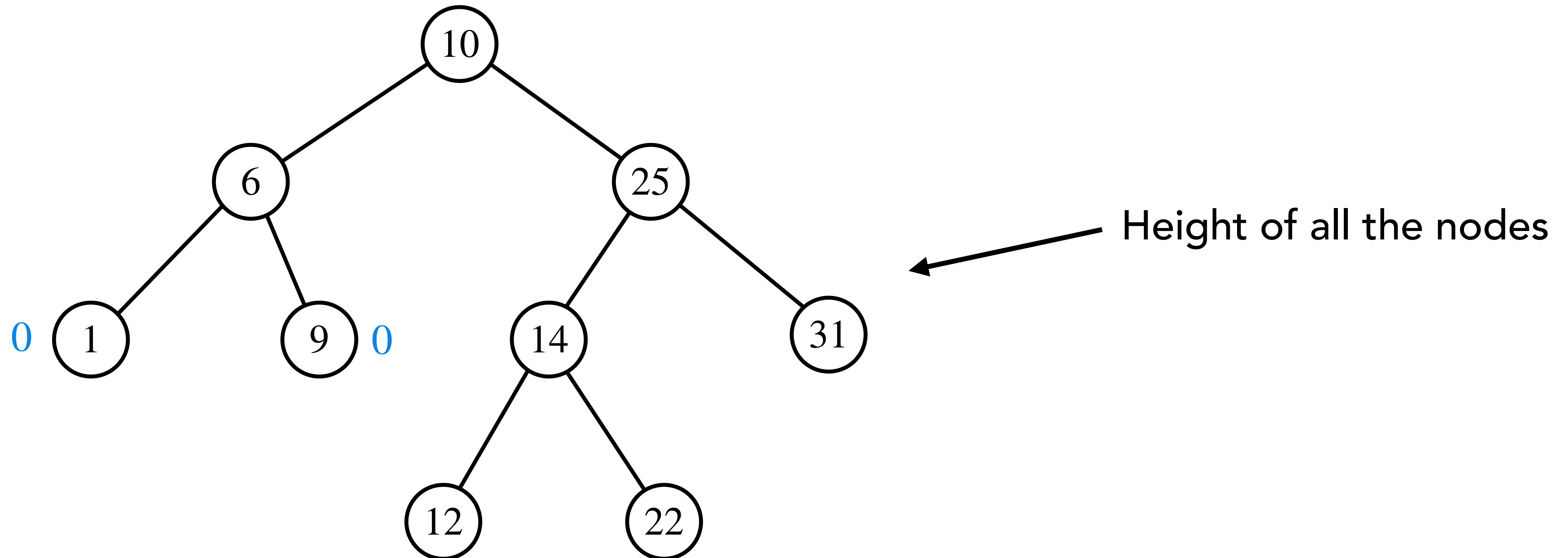
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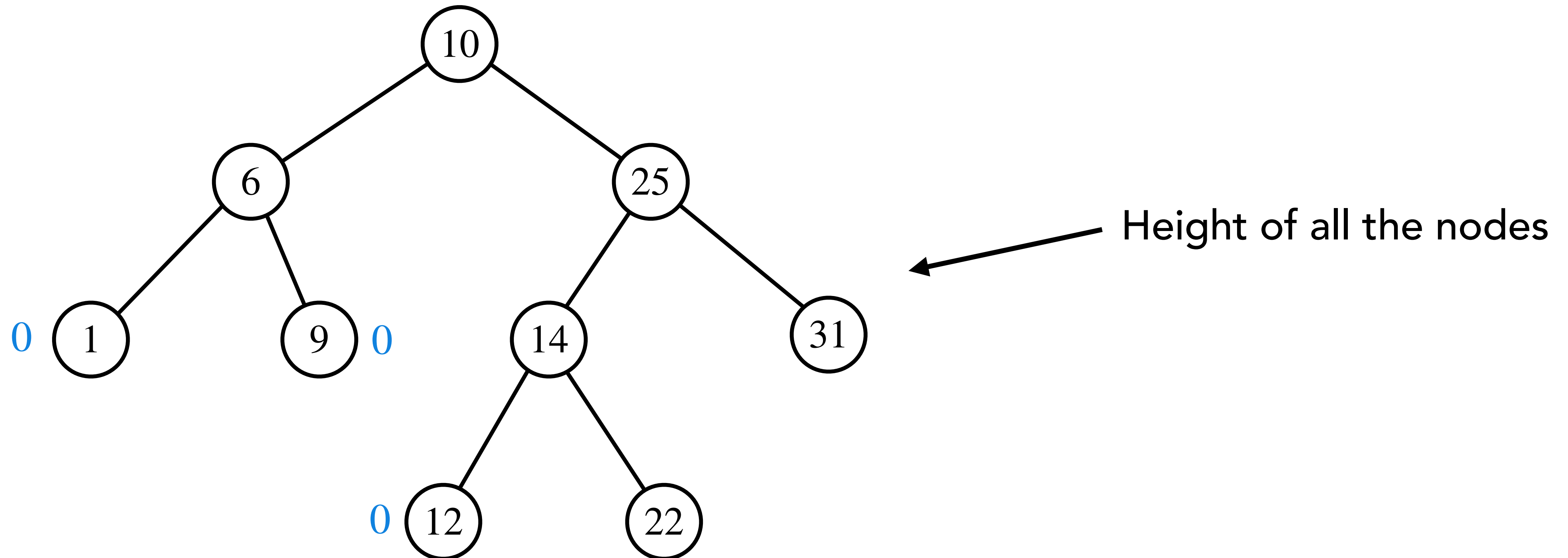
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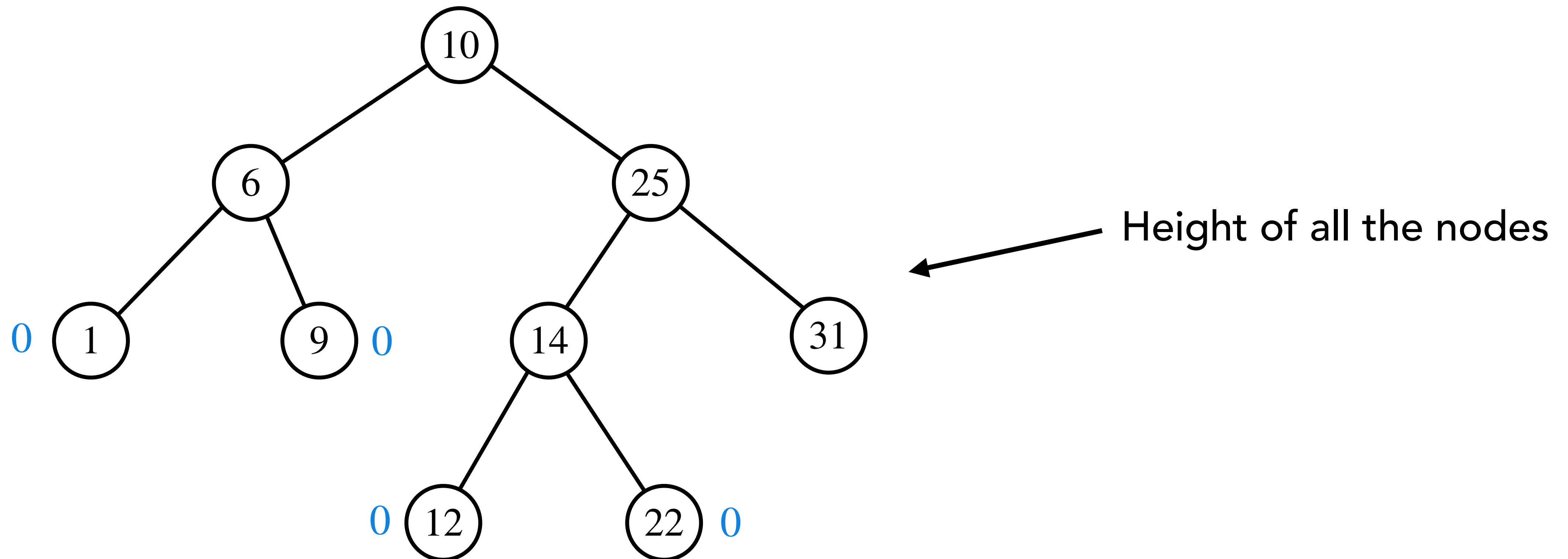
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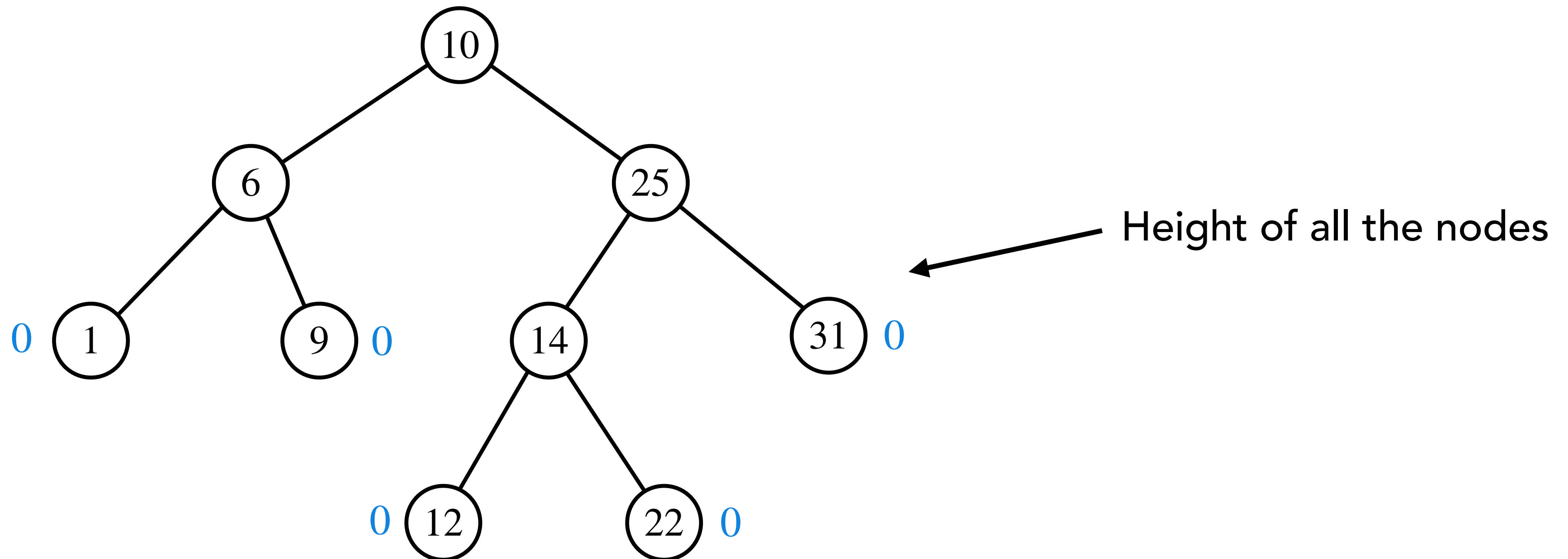
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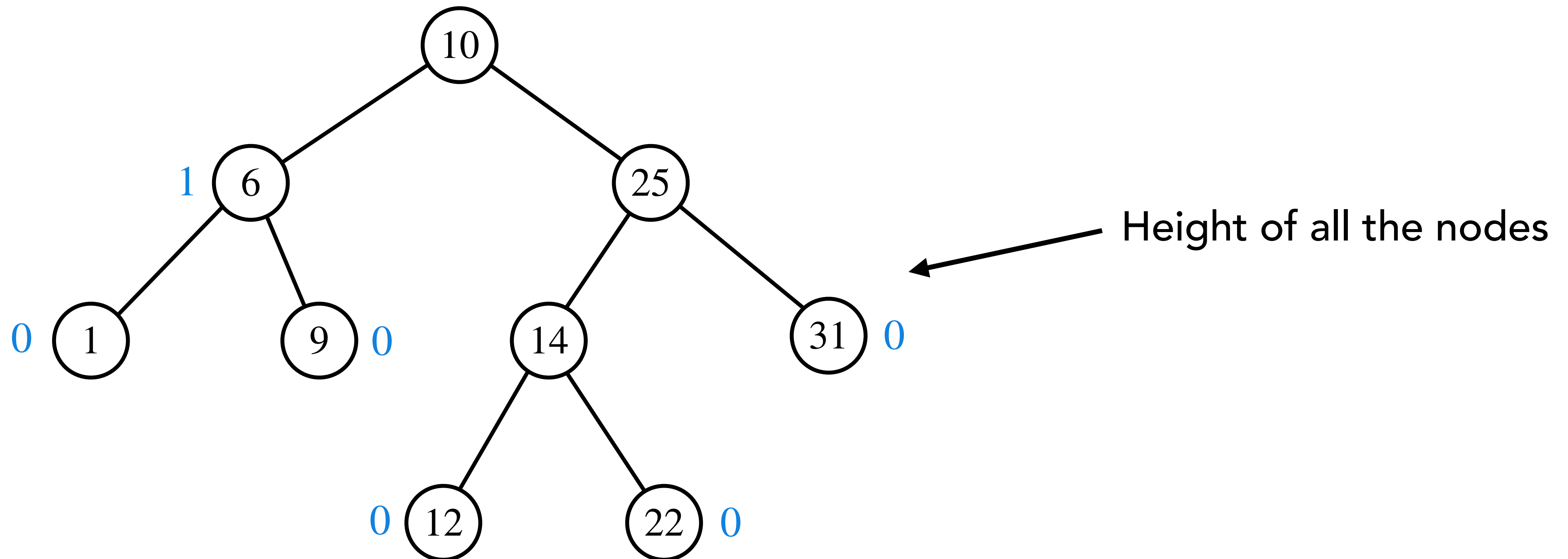
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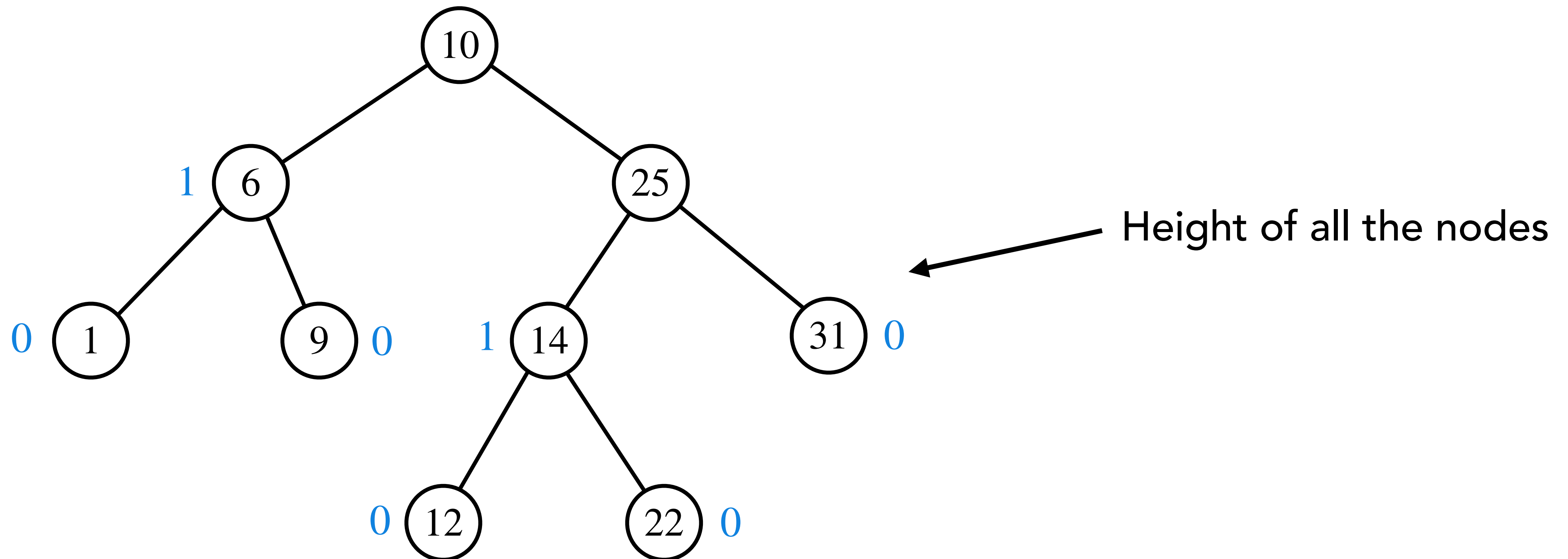
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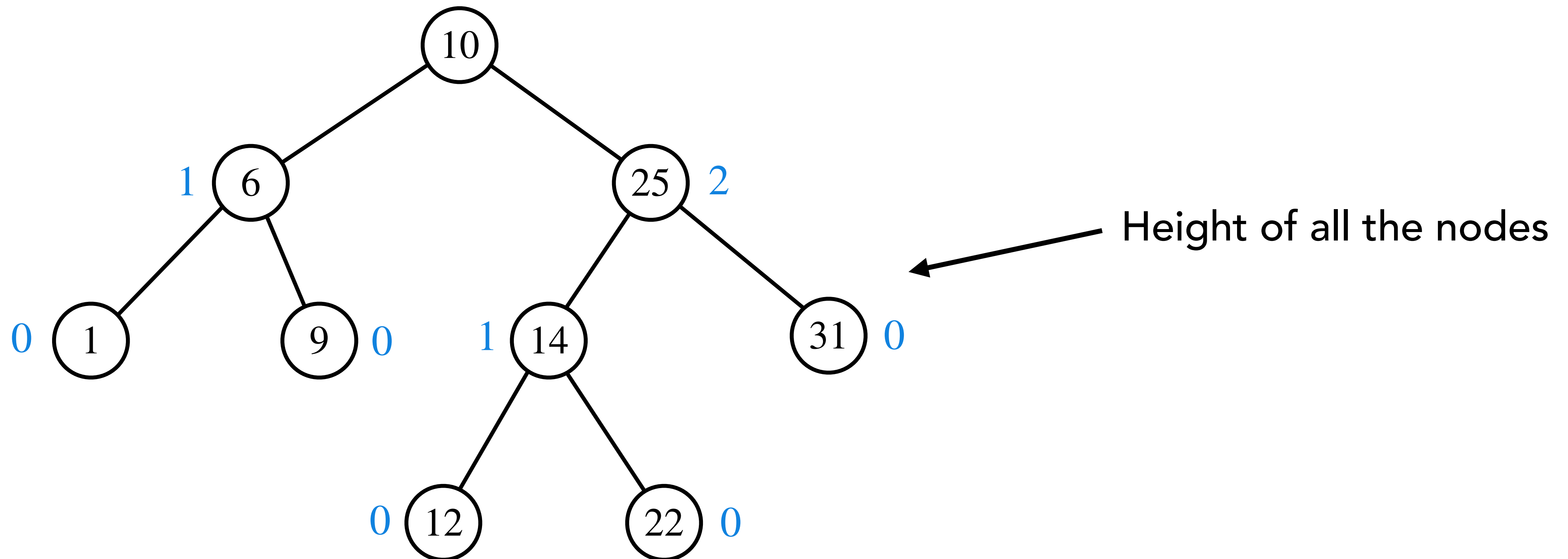
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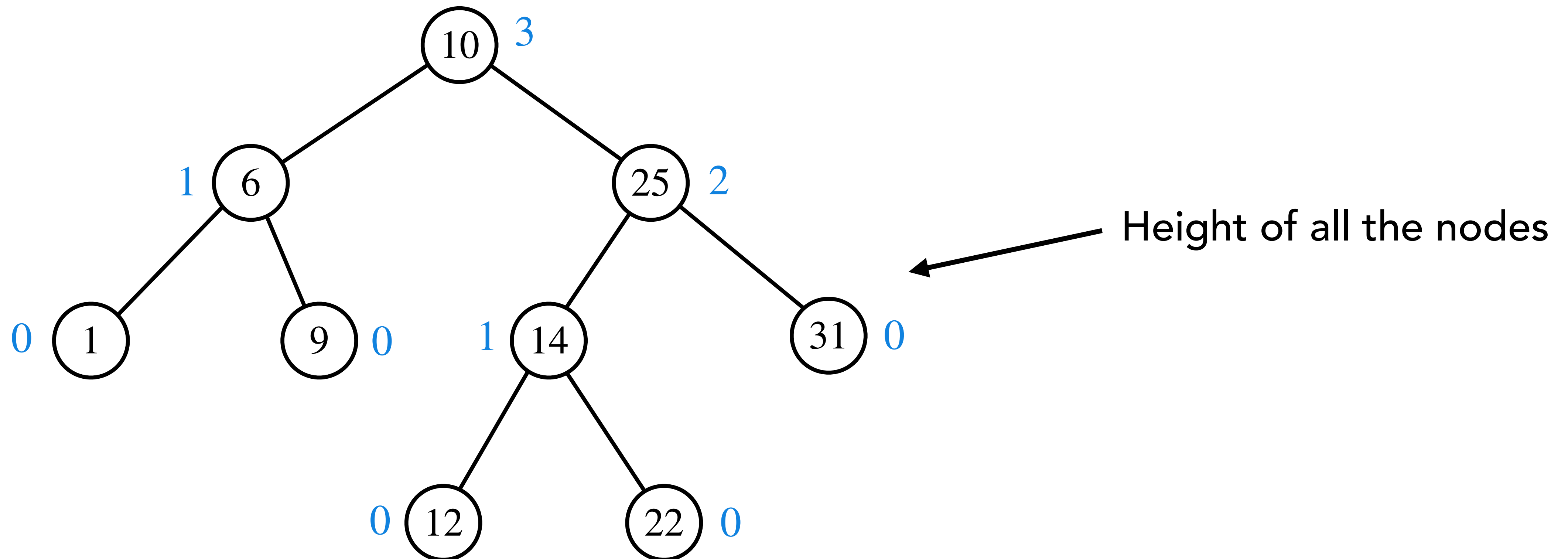
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**Proof of Correctness:** We will prove it using **induction** on the **number of nodes** in the tree.