

# CS2040S

## Data Structures and Algorithms

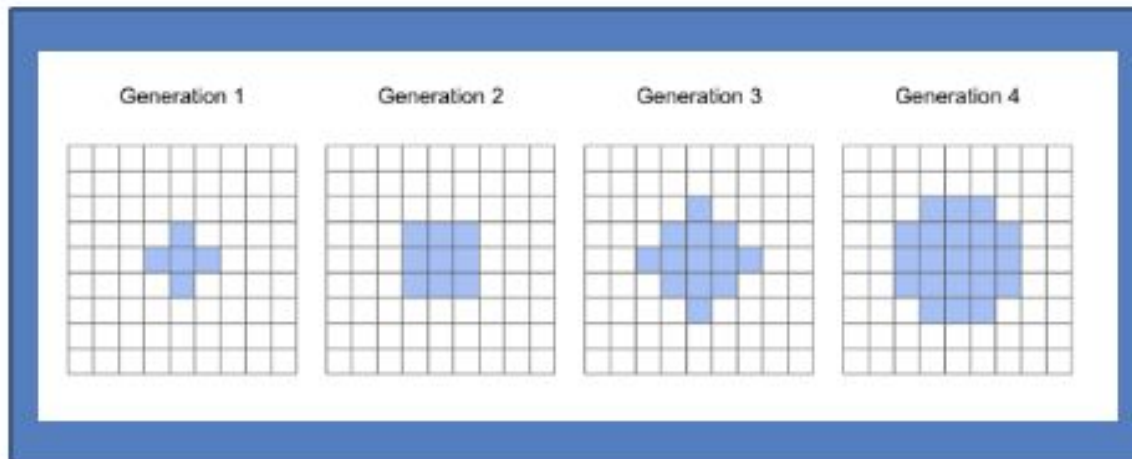
### Puzzle of the Week: Squares

(Courtesy: Riddler)

Start with five shaded squares, infinite grid.

At every iteration, color a square if *at least* three neighboring were colored in the previous iteration.

As  $N$  gets large, how many squares will be shaded in generation  $N$  (as a function of  $N$ )?





# Housekeeping:

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## Problem Set 4 Release:

- Wednesday Release 12-Feb
  - Duration: 1 week
  - Will be on trees





# Plan:

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## Trees

- Terminology
- Traversals
- Operations

## Balanced Trees

- Height-balanced binary search trees
- AVL trees
- Rotations

# Plan:

---

## Trees

- Terminology
- Traversals
- Operations

New concept! A data structure!

## Balanced Trees

- Height-balanced binary search trees
- AVL trees
- Rotations

# Dictionary Interface

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A collection of (key, value) pairs:

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**interface**    **IDictionary**

void    insert(Key k, Value v)

*insert (k,v) into table*

Value    search(Key k)

*get value paired with k*

Key    successor(Key k)

*find next key > k*

Key    predecessor(Key k)

*find next key < k*

void    delete(Key k)

*remove key k (and value)*

boolean    contains(Key k)

*is there a value for k?*

int    size()

*number of (k,v) pairs*

---

# Dictionary Interface

---

A collection of (key, value) pairs:

**interface** IDic

void inse

Value sear

Key successor(Key k)

Key predecessor(Key k)

void delete(Key k)

boolean contains(Key k)

int size()

Assumes that the keys can be totally ordered!

le

k

find next key > k

find next key < k

remove key k (and value)

is there a value for k?

number of (k,v) pairs



# Dictionary

---

## Implementation

Option 1: Sorted array

- insert : ?
- search : ?

Option 2: Unsorted array

- insert : ?
- search : ?

Option 3: Linked list

- insert : ?
- search : ?

# Dictionary

---

## Implementation

### Option 1: Sorted array

- insert : add to middle of array = ??
- search : binary search = ??

### Option 2: Unsorted array

- insert : add to end of array = ??
- search : unsorted = ??

### Option 3: Linked list

- insert : add to head of list = ??
- search : list traversal = ??

# Dictionary

---

## Implementation

### Option 1: Sorted array

- insert : add to middle of array =  $O(n)$
- search : binary search =  $O(\log n)$

### Option 2: Unsorted array

- insert : add to end of array = ??
- search : unsorted = ??

### Option 3: Linked list

- insert : add to head of list = ??
- search : list traversal = ??

# Dictionary

---

## Implementation

### Option 1: Sorted array

- insert : add to middle of array =  $O(n)$
- search : binary search =  $O(\log n)$

### Option 2: Unsorted array

- insert : add to end of array =  $O(1)$
- search : unsorted =  $O(n)$

### Option 3: Linked list

- insert : add to head of list = ??
- search : list traversal = ??



# Dictionary

---

## Implementation

### Option 1: Sorted array

- insert : add to middle of array =  $O(n)$
- search : binary search =  $O(\log n)$

### Option 2: Unsorted array

- insert : add to end of array =  $O(1)$
- search : unsorted =  $O(n)$

### Option 3: Linked list

- insert : add to head of list =  $O(1)$
- search : list traversal =  $O(n)$

# Dictionary

---

## Implementation

### Option 1: Sorted array

- insert : add to middle of array =  $O(n)$
- search : binary search =  $O(\log n)$

### Option 2: Unsorted array

- insert : add to end of array =  $O(1)$
- search : unsorted =  $O(n)$

### Option 3: Linked list

- insert : add to head of list =  $O(1)$
- search : list traversal =  $O(n)$

Notice here that all the operations seem to have something be in linear time.

Can we do better?

# Dictionary Implementation

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## Possible Choices:

- Implement using an array
- Implement using a queue.
- Implement using a linked list
- ...

# Binary Search Trees

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1. Terminology and Definitions 

2. Basic operations:

- height
- search, insert
- searchMin, searchMax

3. Traversals

- in-order, pre-order, post-order

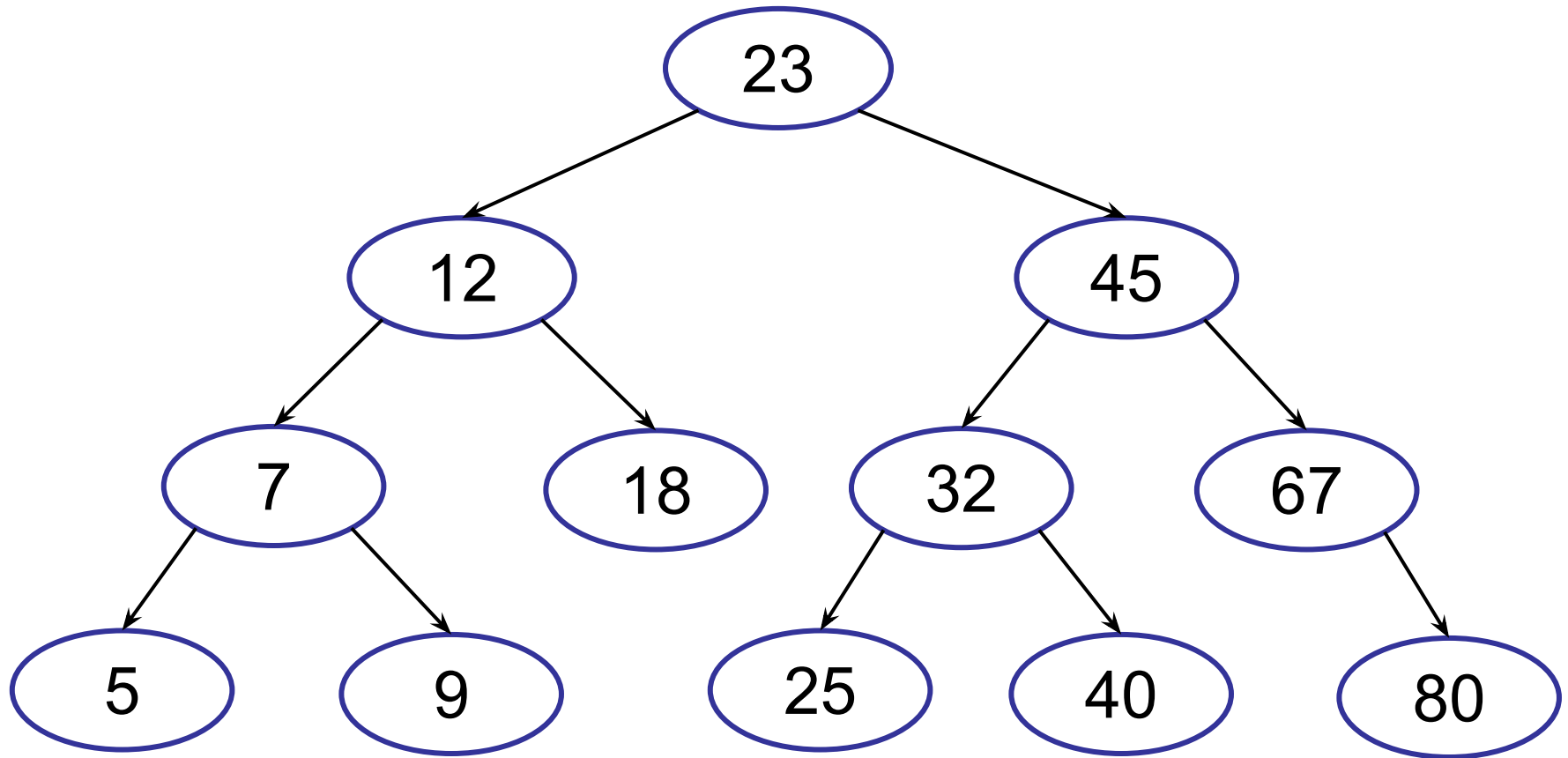
4. Other operations



# Dictionary

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Implementation idea: Tree



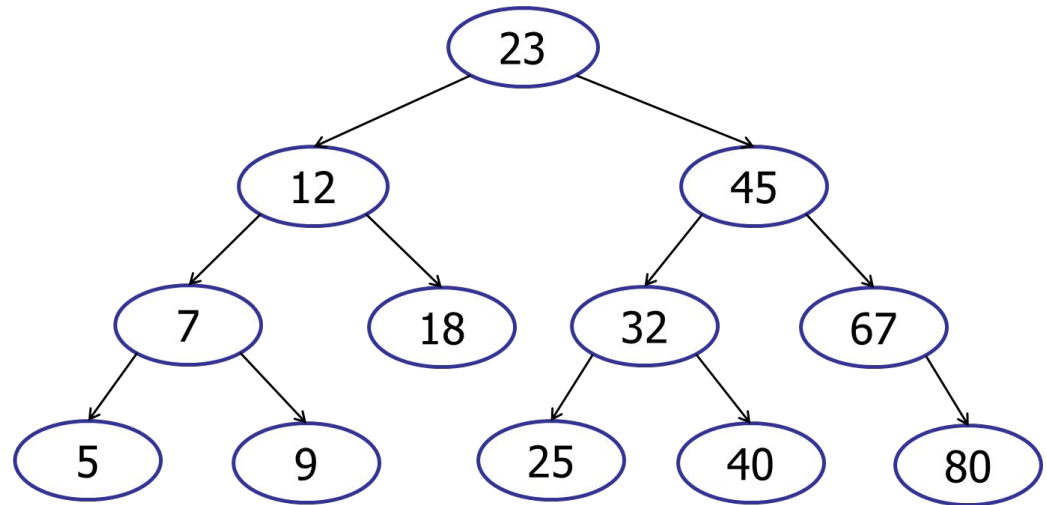
# Dictionary

---

## Implementation idea: Tree

### Critical Components:

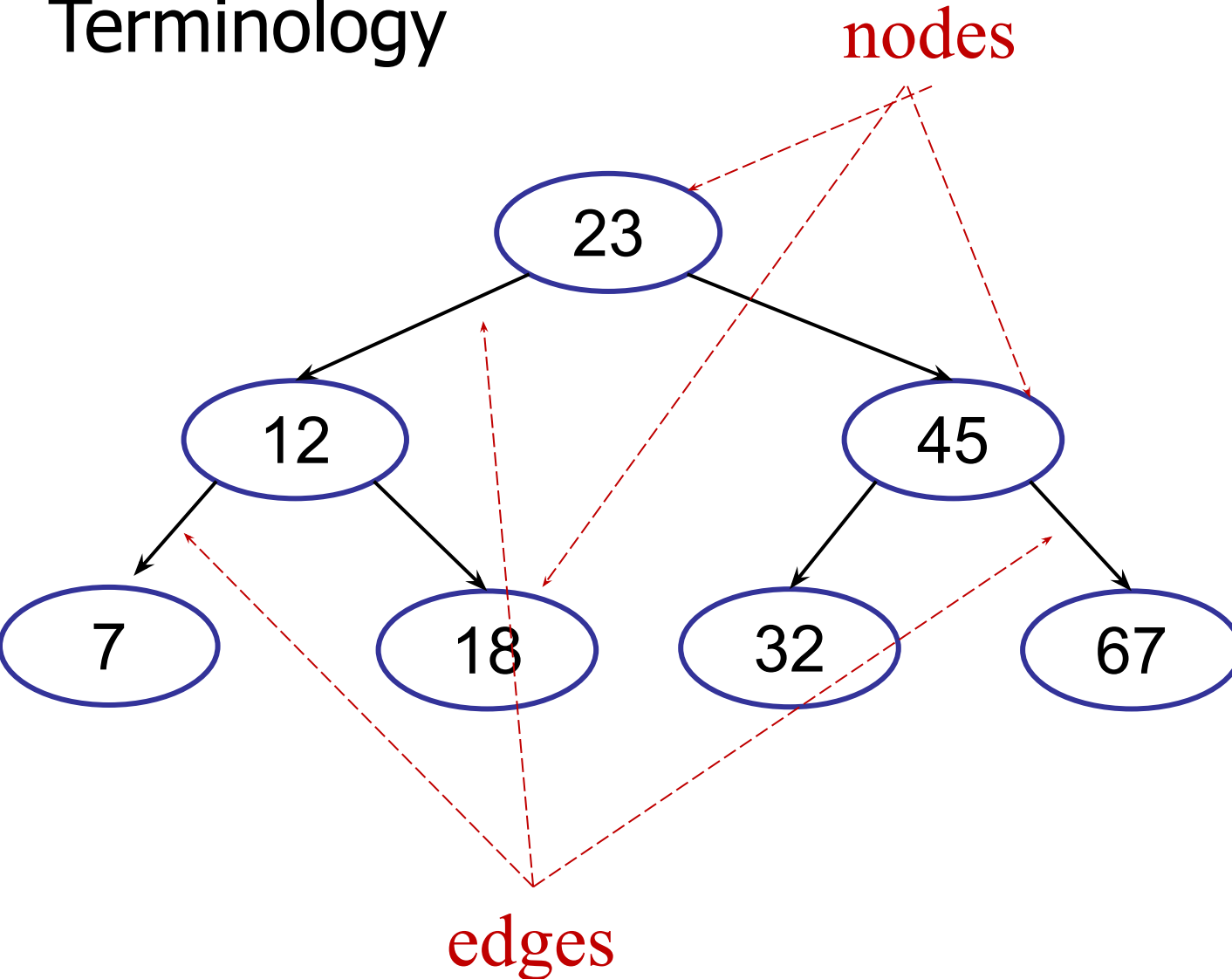
- Nodes
- Edges directed from one node to another.
- Root (?)
- No cycles



# Binary Tree

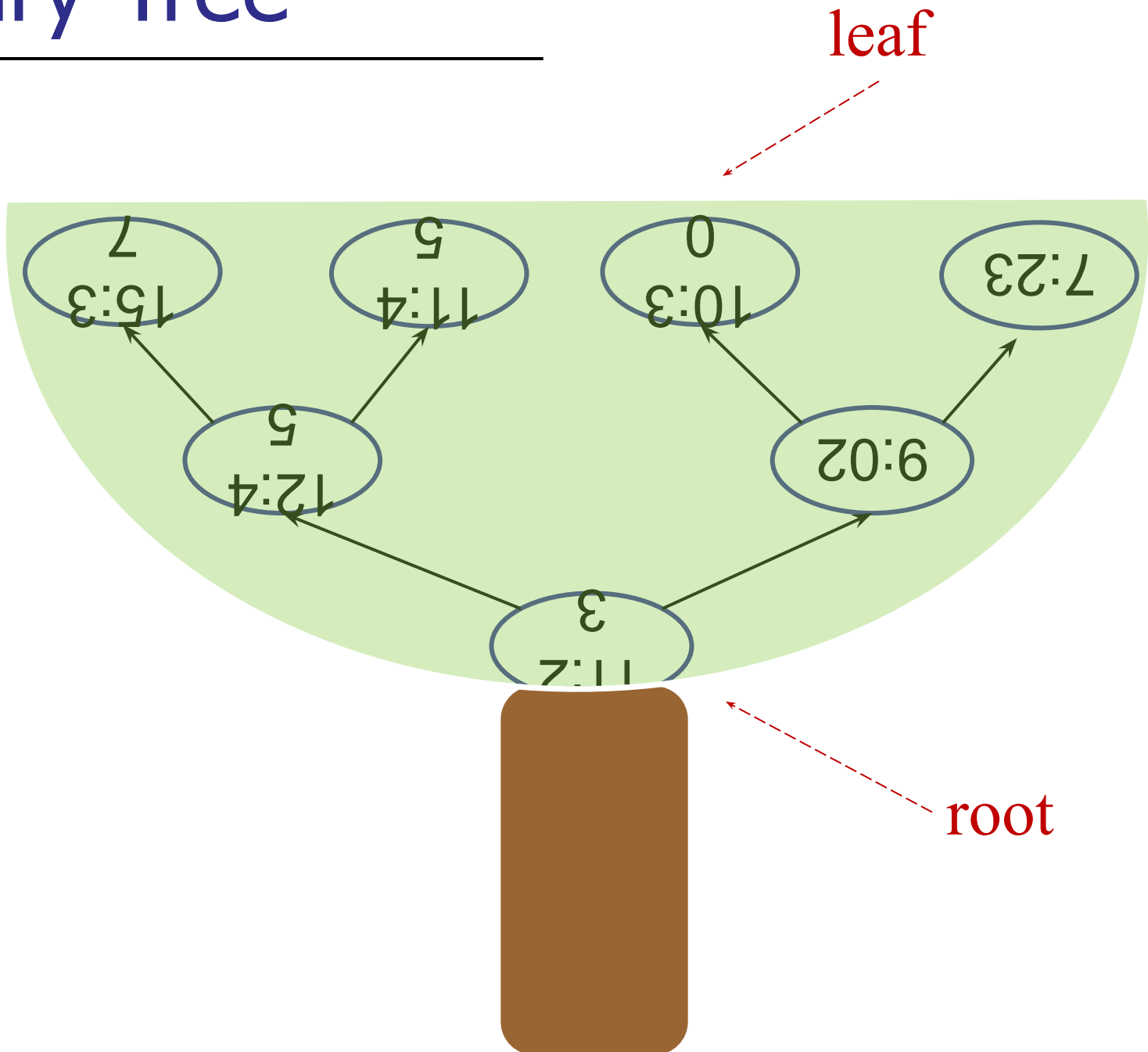
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## Terminology



# Binary Tree

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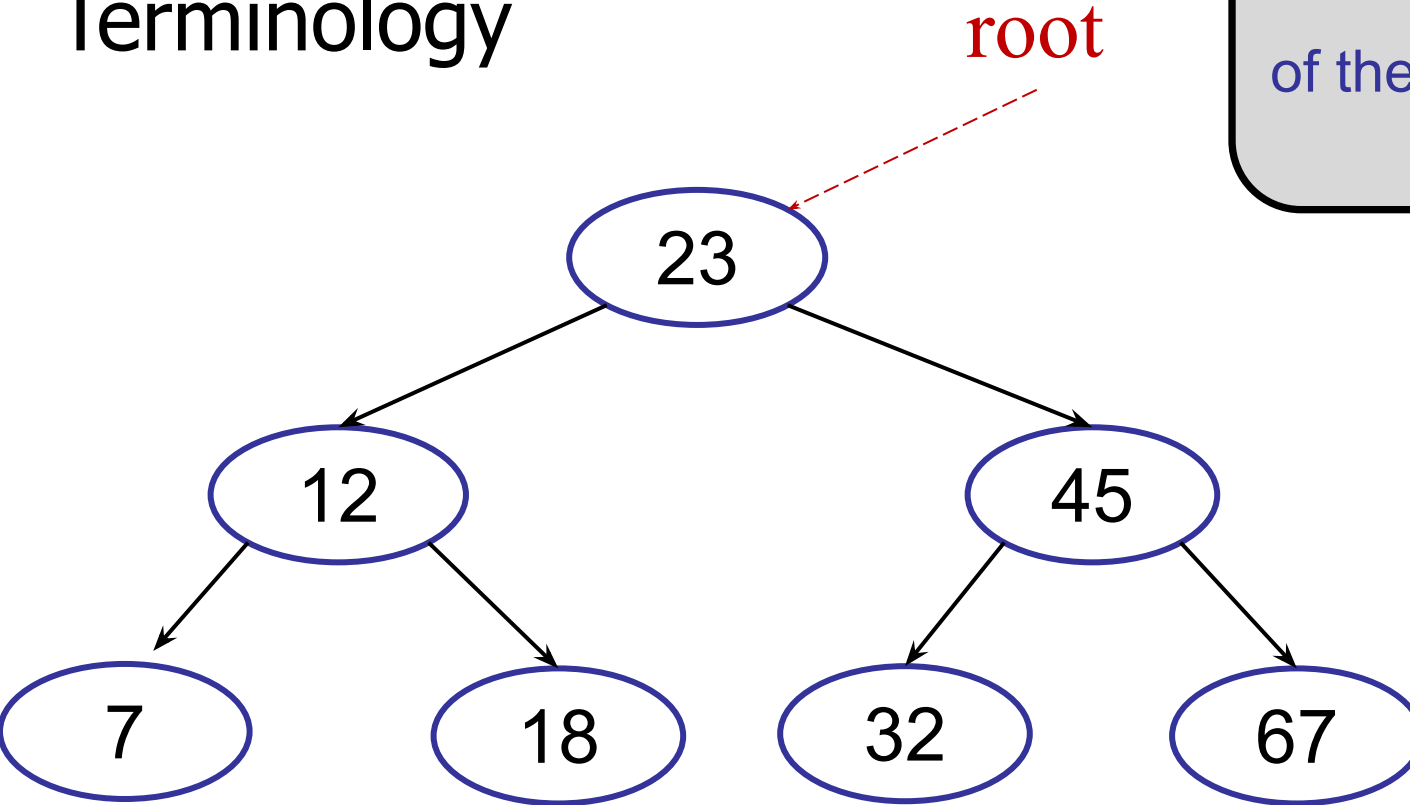


# Binary Tree

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## Terminology

Root node is the  
node at the “start”  
of the tree

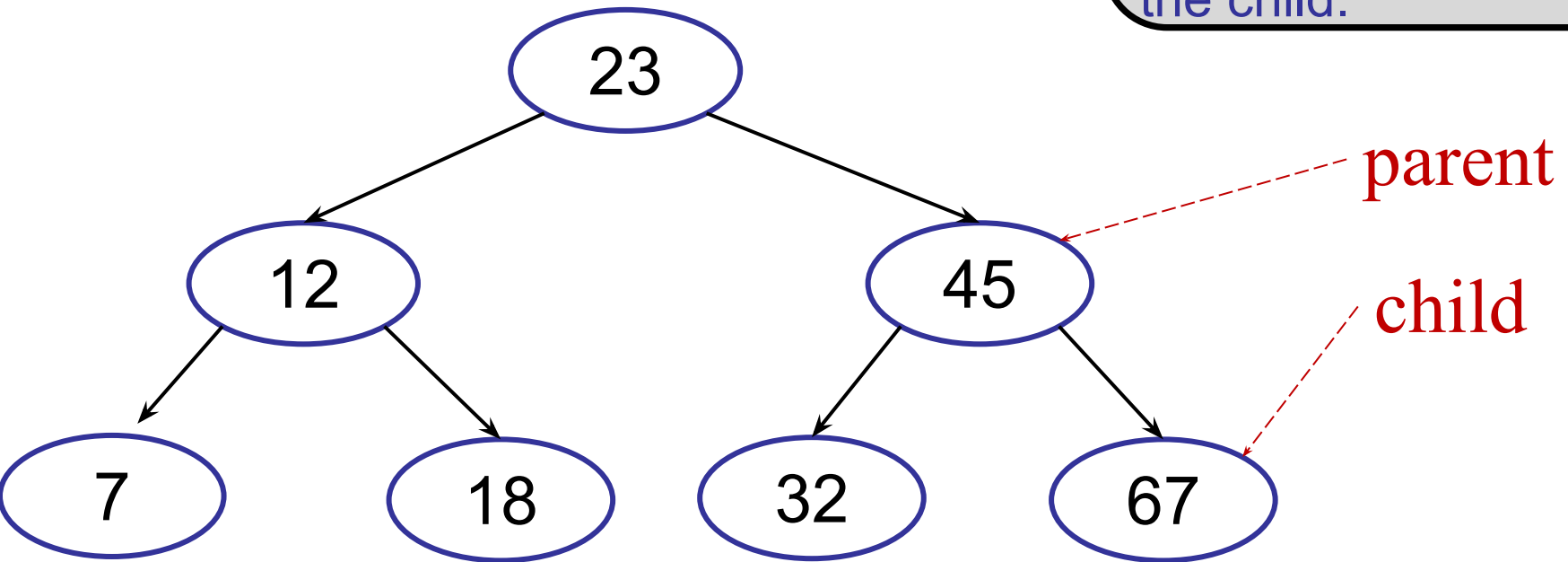


# Binary Tree

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## Terminology

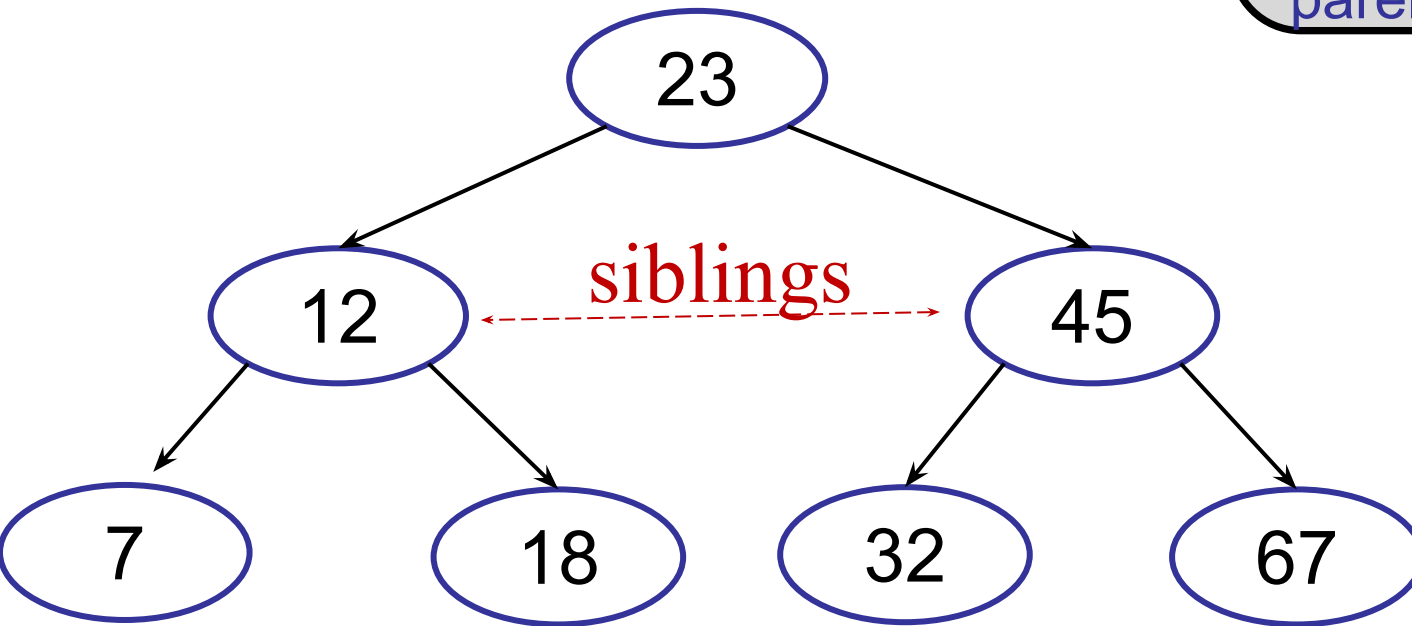
A node is a “child” of a “parent” node if the parent points to the child.



# Binary Tree

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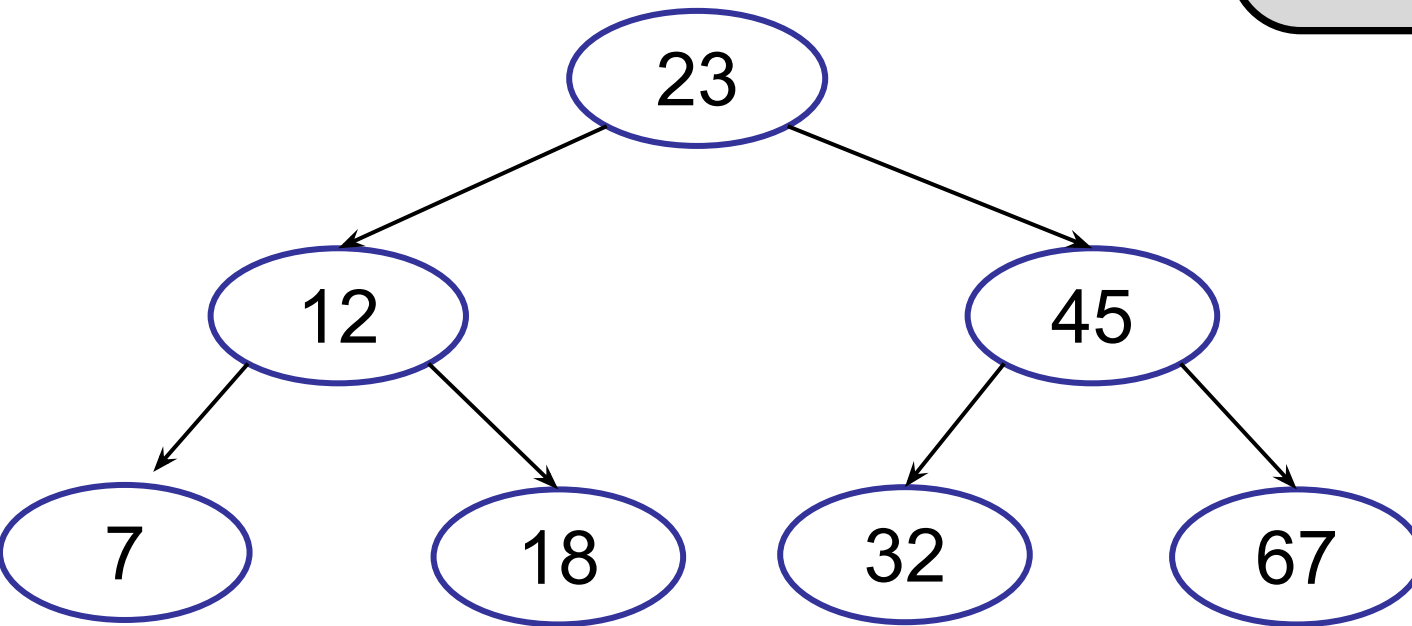
Two nodes are called “siblings” if they have the same “parent”



# Binary Tree

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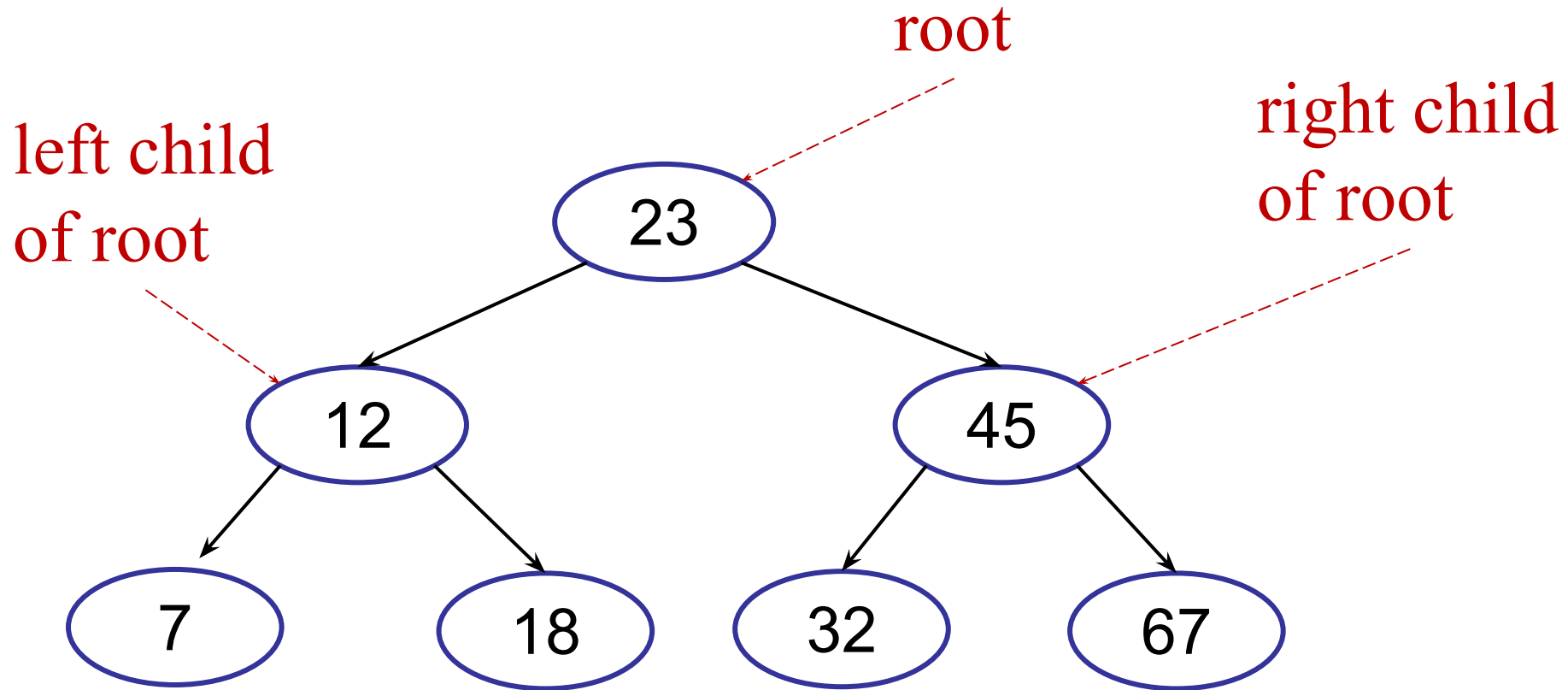
A leaf has 0 children.



# Binary Tree

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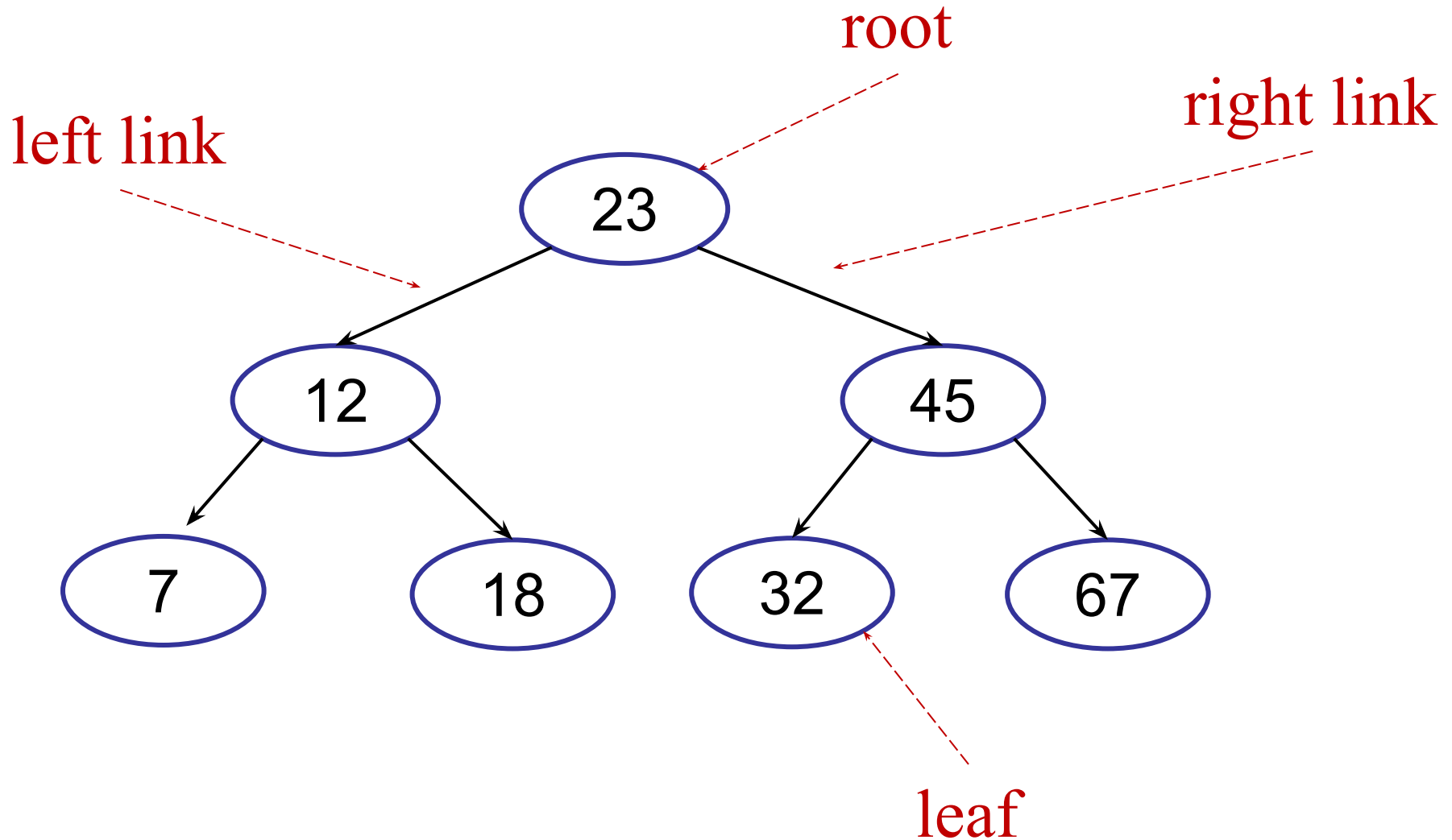
## Terminology



# Binary Tree

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## Terminology

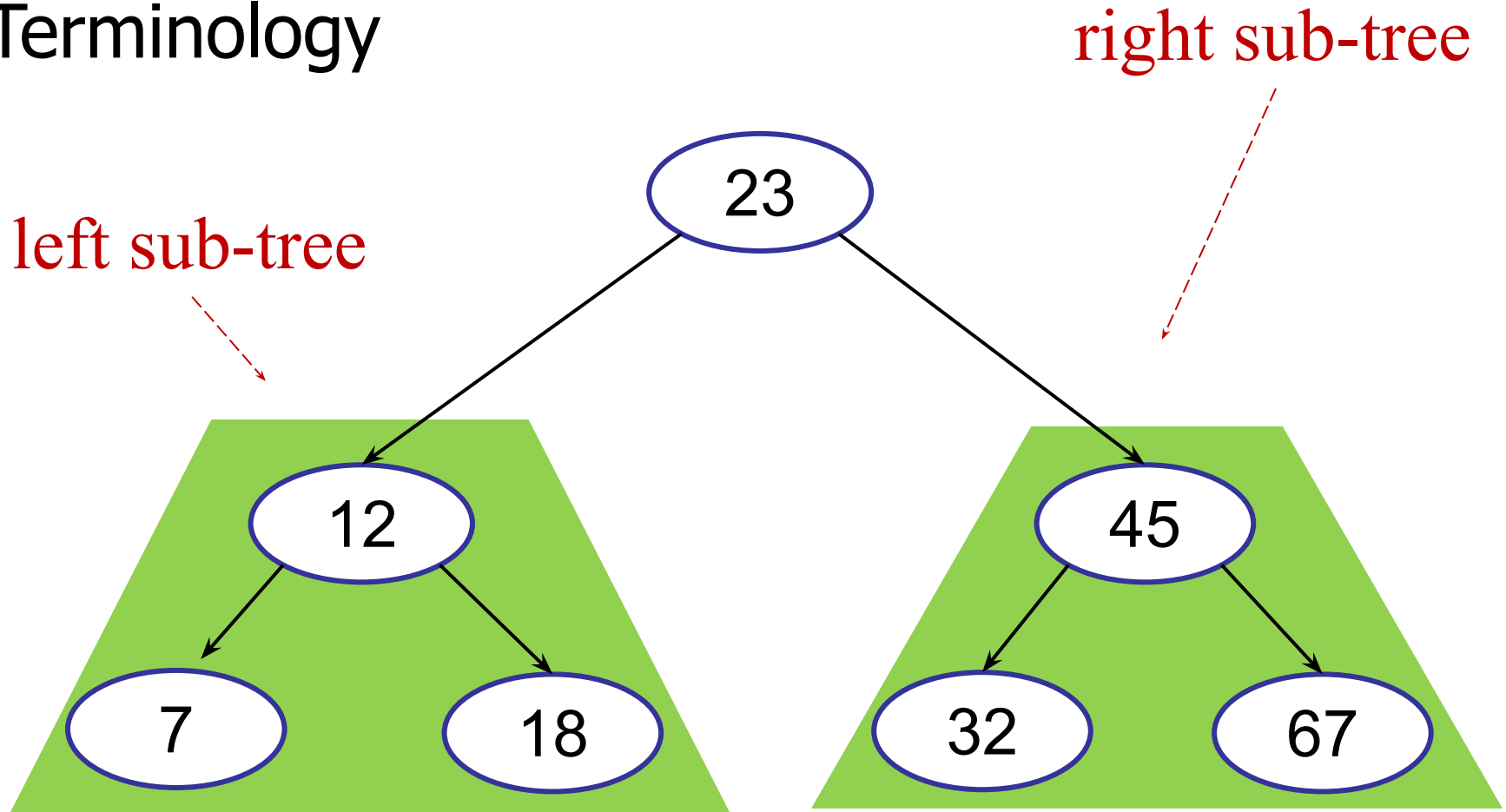




# Binary Tree

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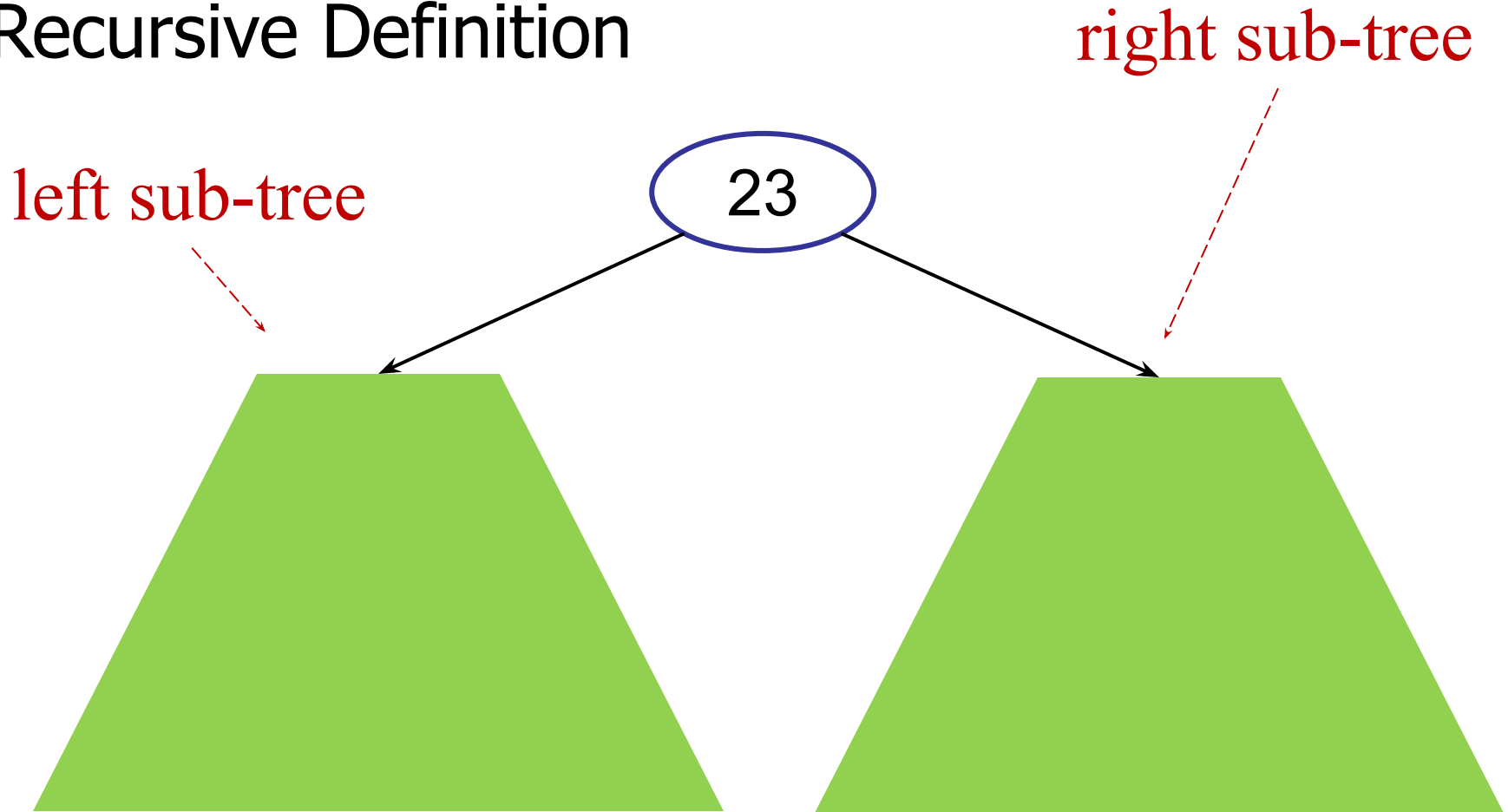
## Terminology



# Binary Tree

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## Recursive Definition



**A binary tree is either:**

<b>(a) empty</b>	<b>; or</b>
<b>(b) a node pointing to two binary trees</b>	

# Binary Tree

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Java??

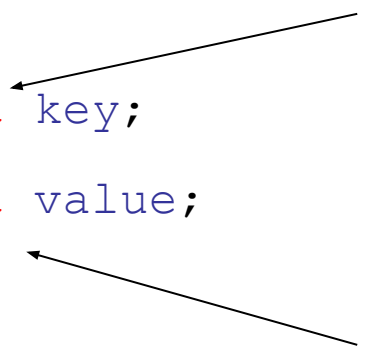
```
public class TreeNode {  
  
    private TreeNode leftTree;  
    private TreeNode rightTree;  
  
    private KeyType key;  
    private ValueType value;  
  
    // Remainder of binary tree implementation  
}
```

# Binary Tree

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Java??

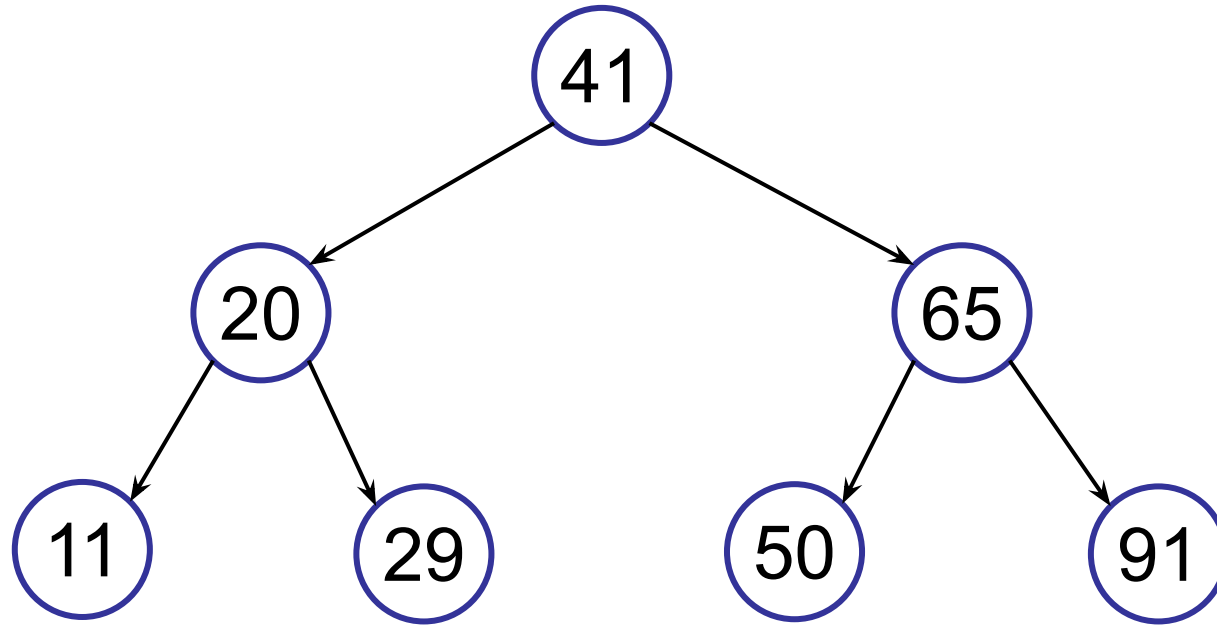
```
public class TreeNode {  
  
    private TreeNode leftTree;  
    private TreeNode rightTree;  
  
    private int key;  
    private int value;  
  
    // Remainder of binary tree implementation  
}
```



Example:  
We want to store  
integer keys and  
values.

# Binary **Search** Trees (BST)

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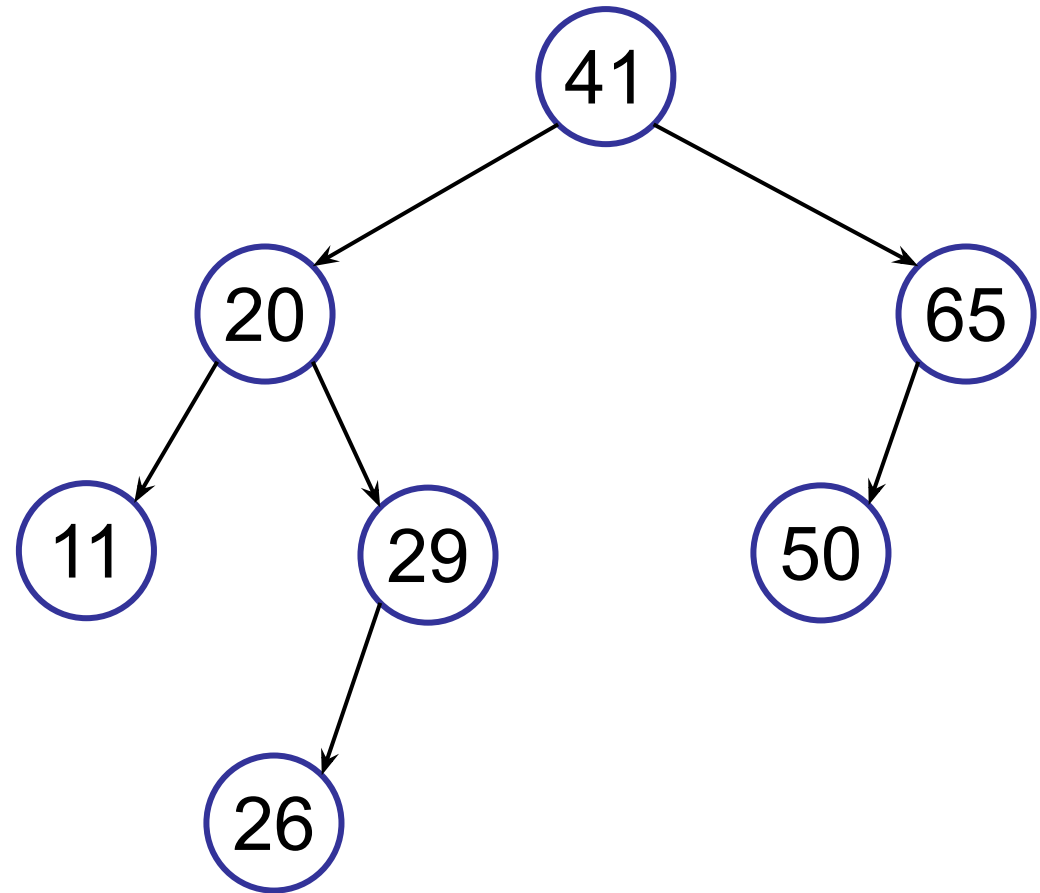


## **BST Property:**

all keys in left sub-tree < key < all keys in right sub-tree

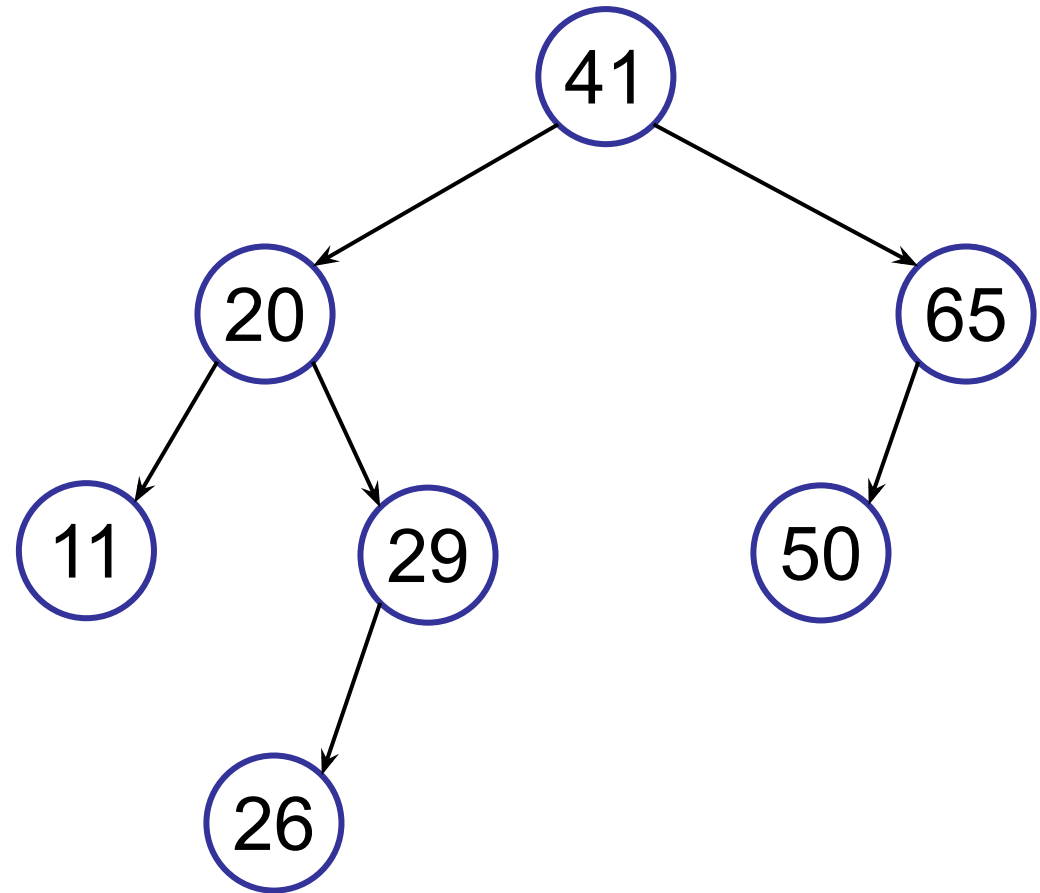
Is this a binary search tree?

1. Yes
2. No
3. I don't know.



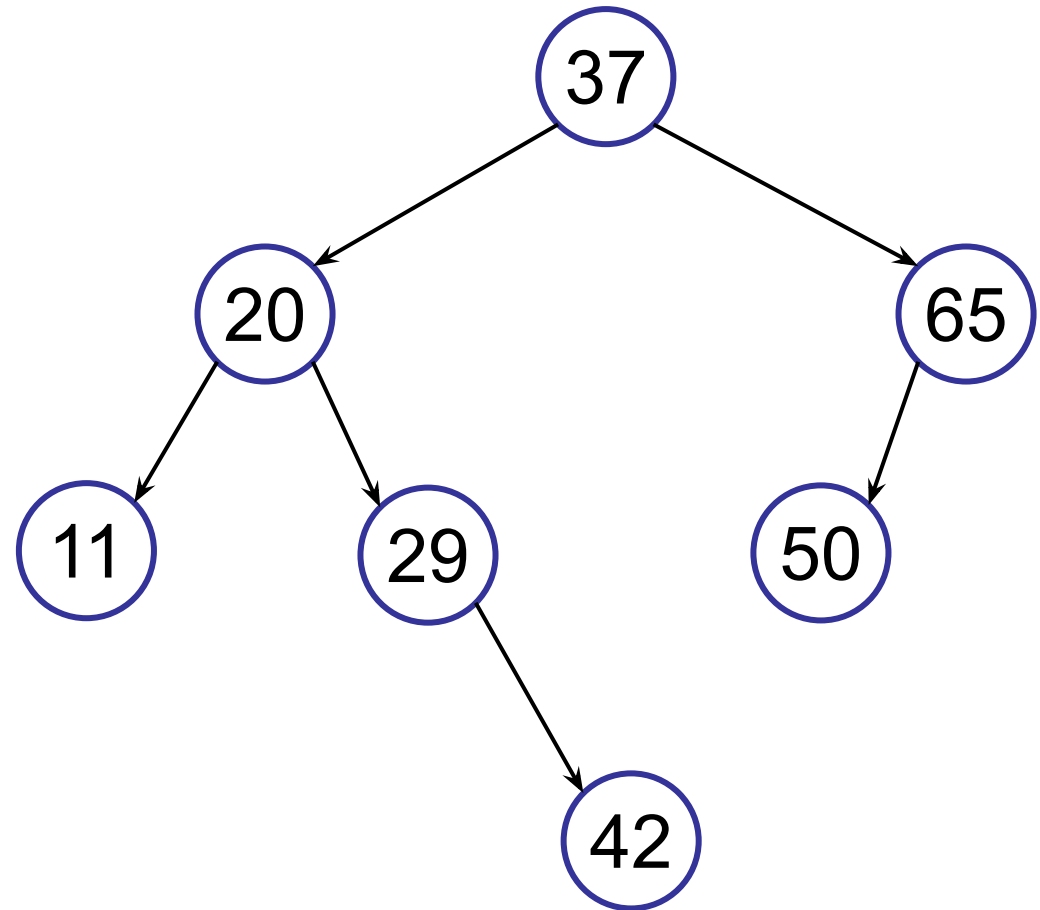
Is this a binary search tree?

- ✓ 1. Yes
- 2. No
- 3. I don't know.



Is this a binary search tree?

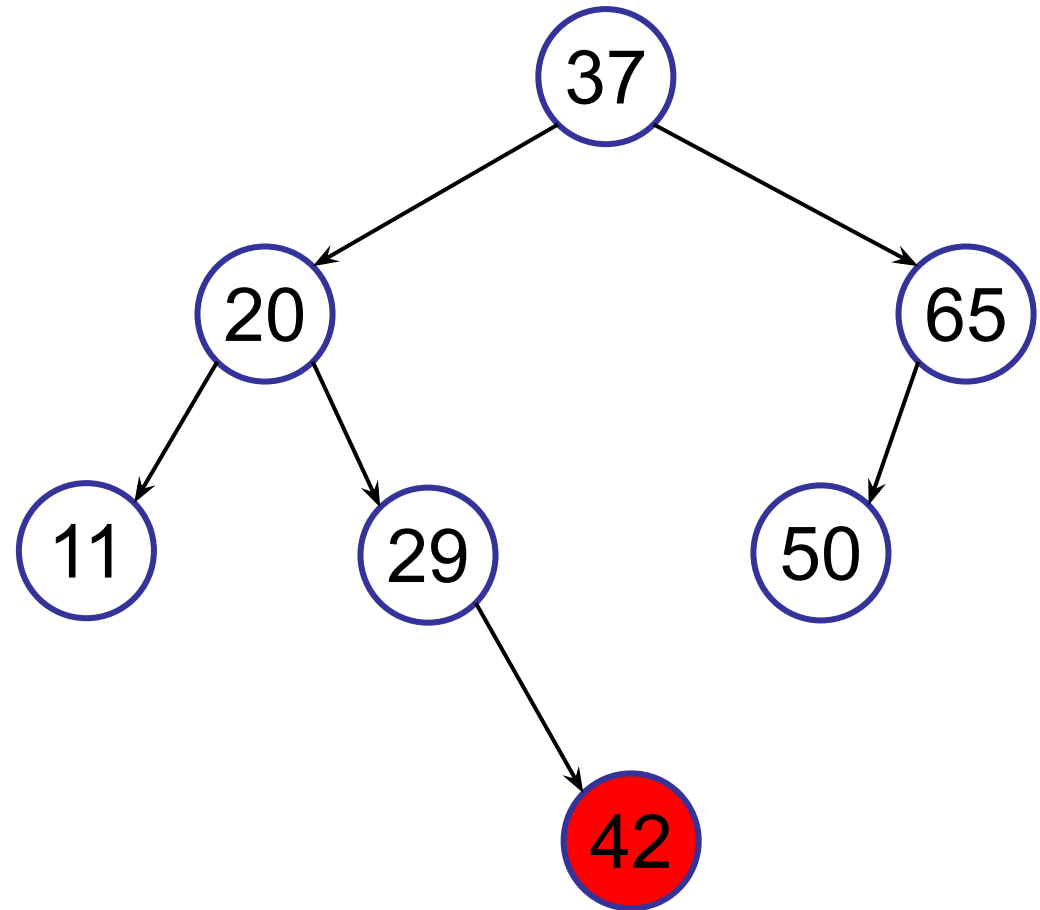
1. Yes
2. No
3. I don't know.





Is this a binary search tree?

1. Yes
- ✓ 2. No
3. I don't know.




# Binary Search Trees

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## 1. Terminology and Definitions

## 2. Basic operations:

- height 
- search, insert
- searchMin, searchMax

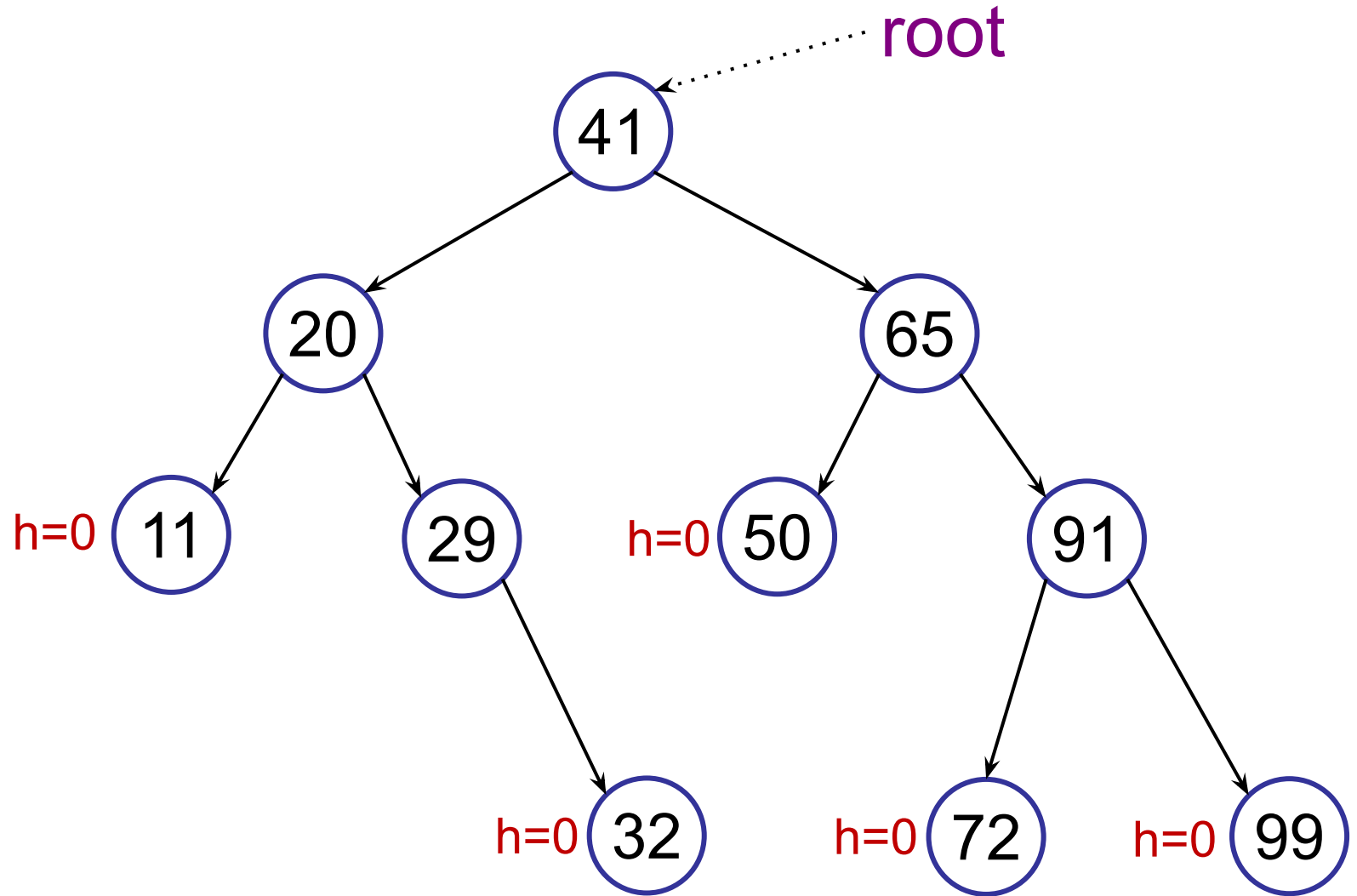
## 3. Traversals

- in-order, pre-order, post-order

## 4. Other operations

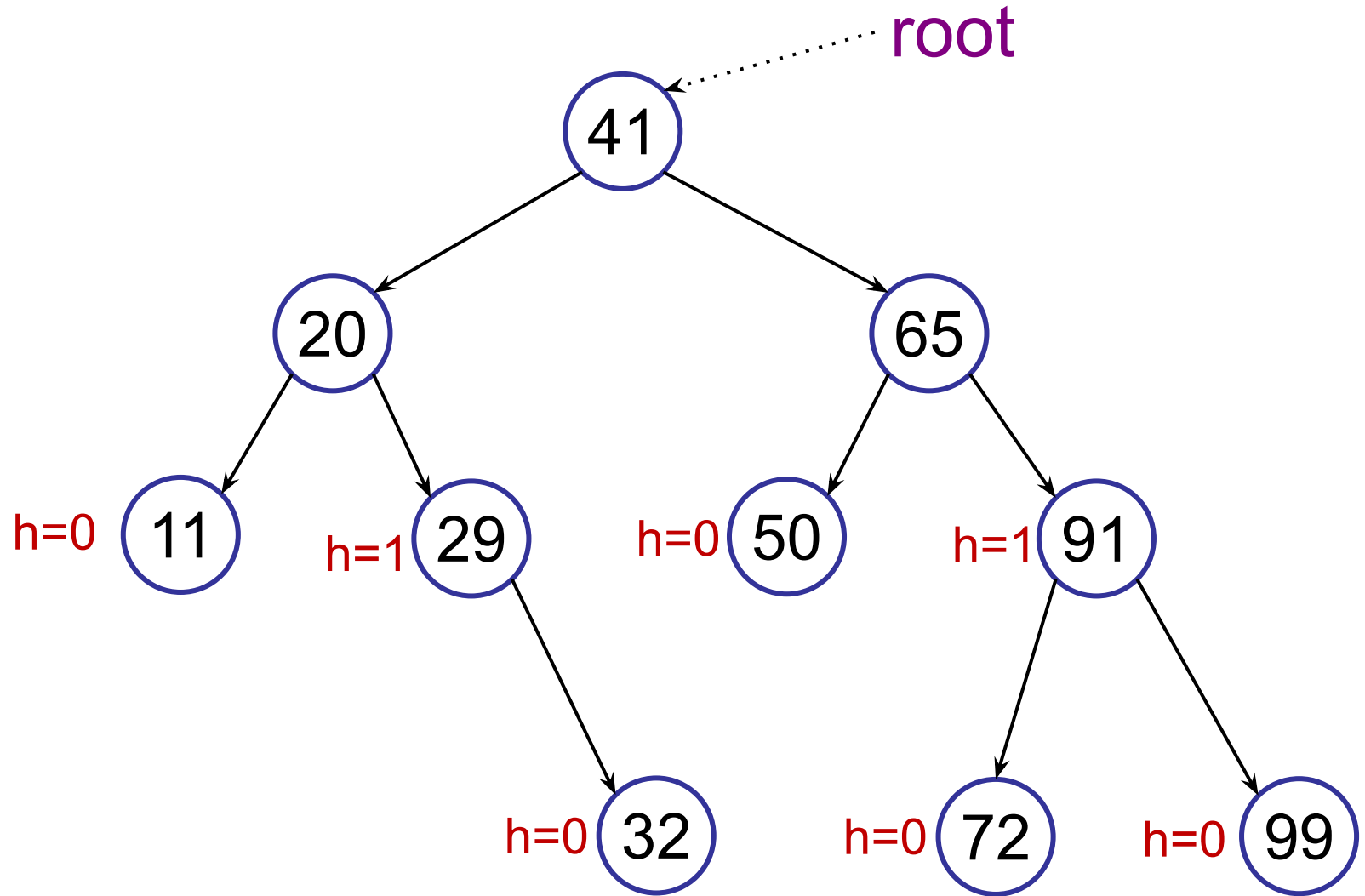
# Height of a Binary Tree

---



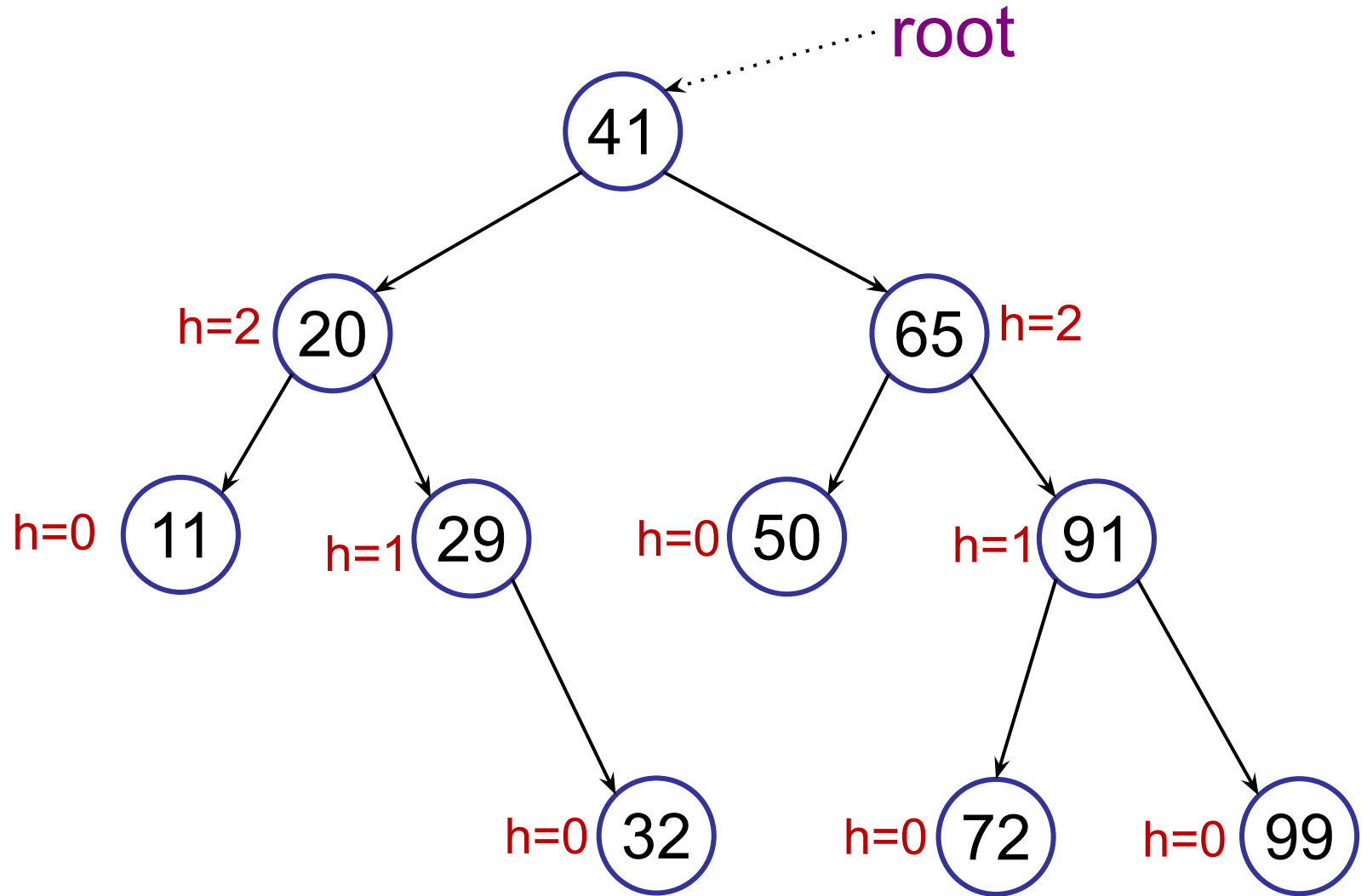
# Height of a Binary Tree

---



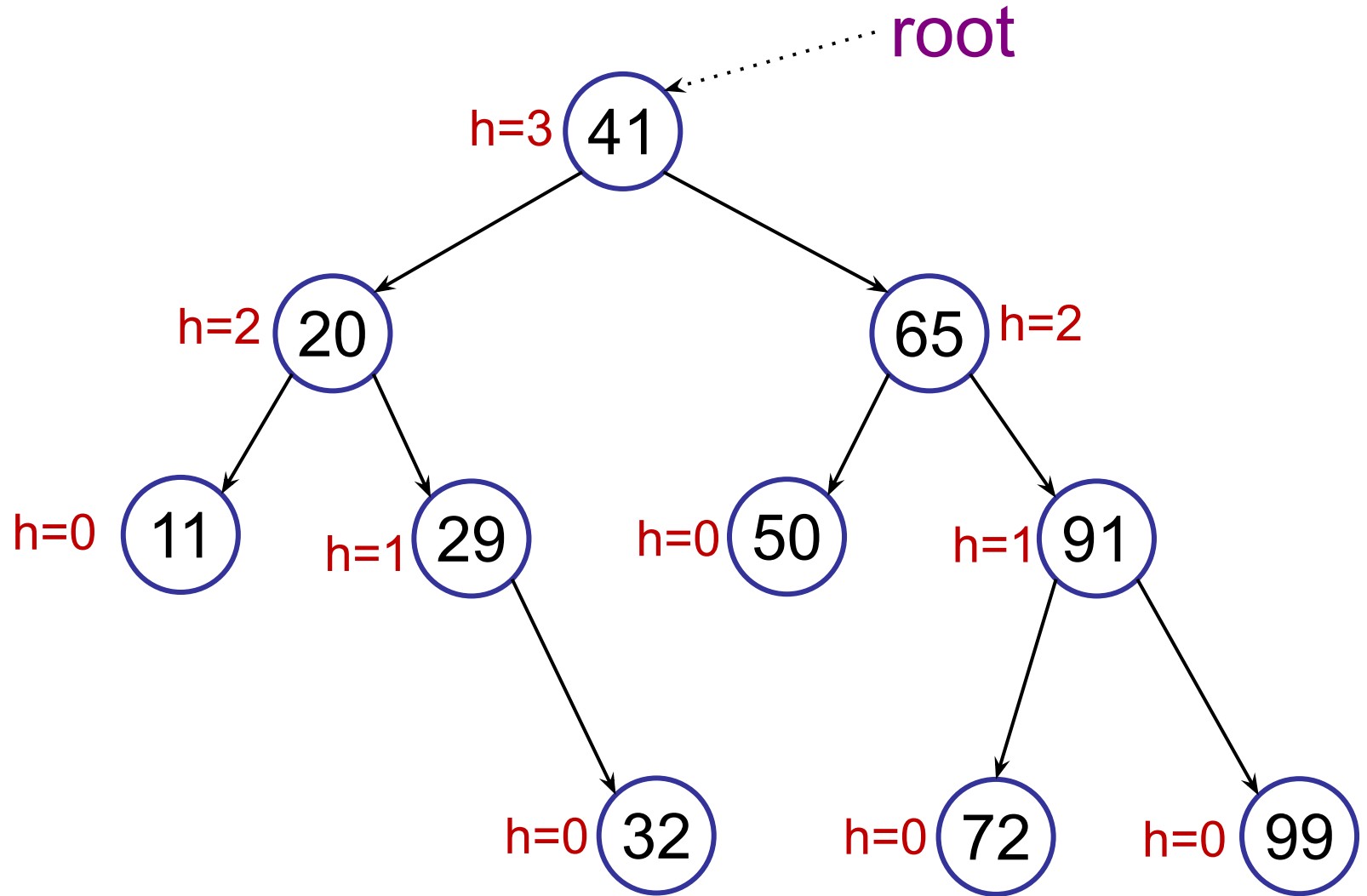
# Height of a Binary Tree

---



# Height of a Binary Tree

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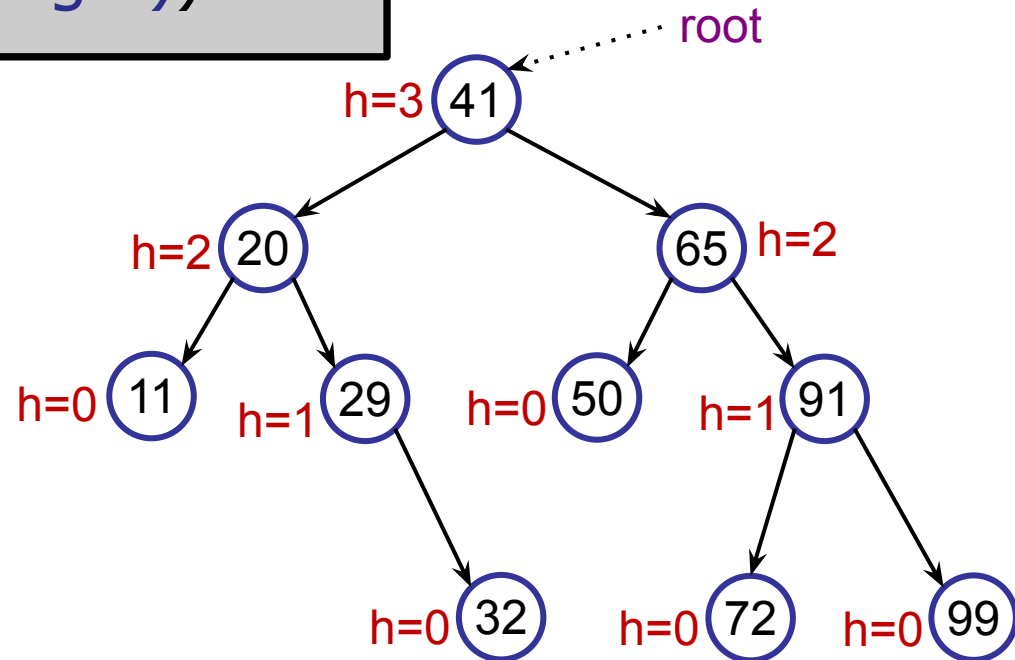
# Height of a Binary Tree

Height:

Number of edges on longest path from root to leaf.

$h(v) = 0$  (if  $v$  is a leaf)

$h(v) = \max(h(v.\text{left}), h(v.\text{right})) + 1$



(For simplicity:  $h(\text{null}) = -1$ )

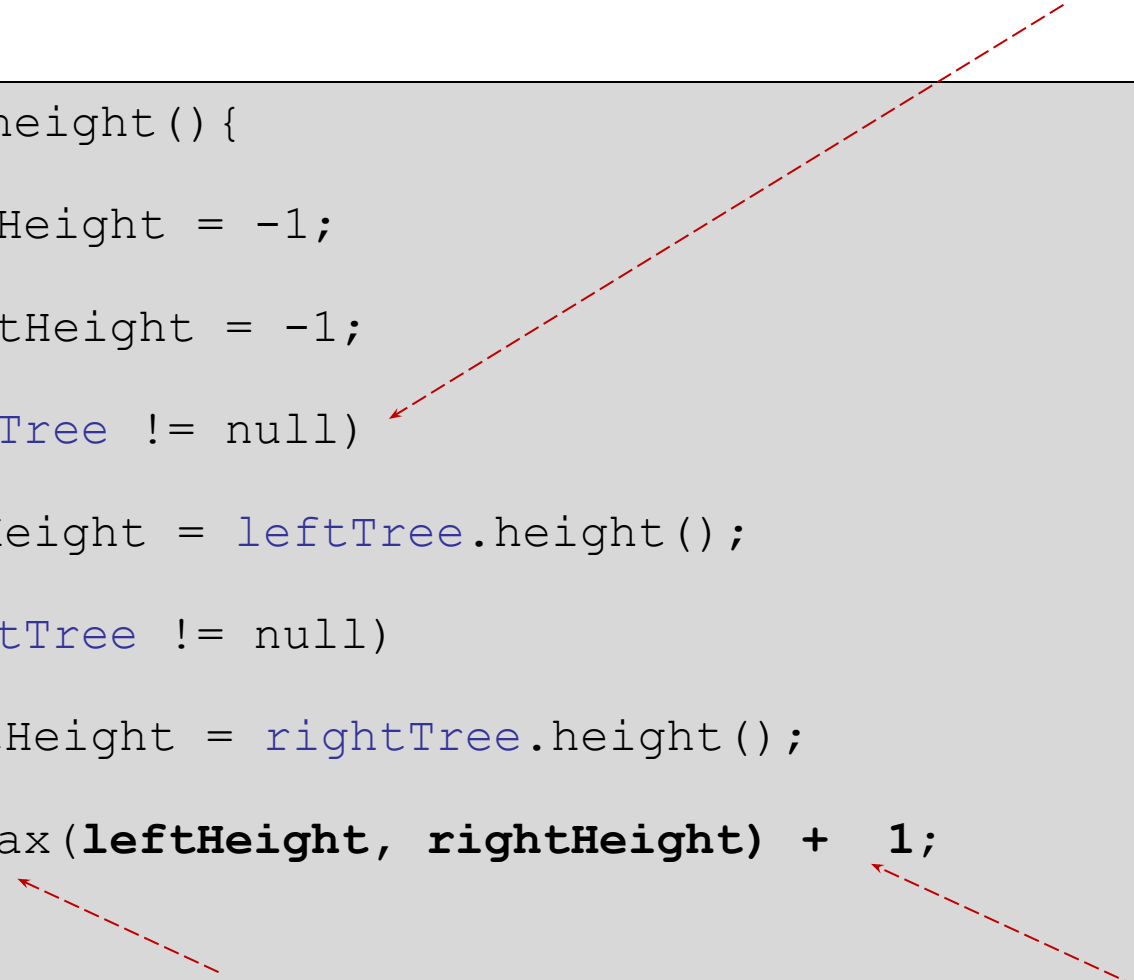
# Binary Tree

---

## Calculating the heights

check for null

```
public int height() {  
    int leftHeight = -1;  
    int rightHeight = -1;  
    if (leftTree != null)  
        leftHeight = leftTree.height();  
    if (rightTree != null)  
        rightHeight = rightTree.height();  
    return max(leftHeight, rightHeight) + 1;  
}
```



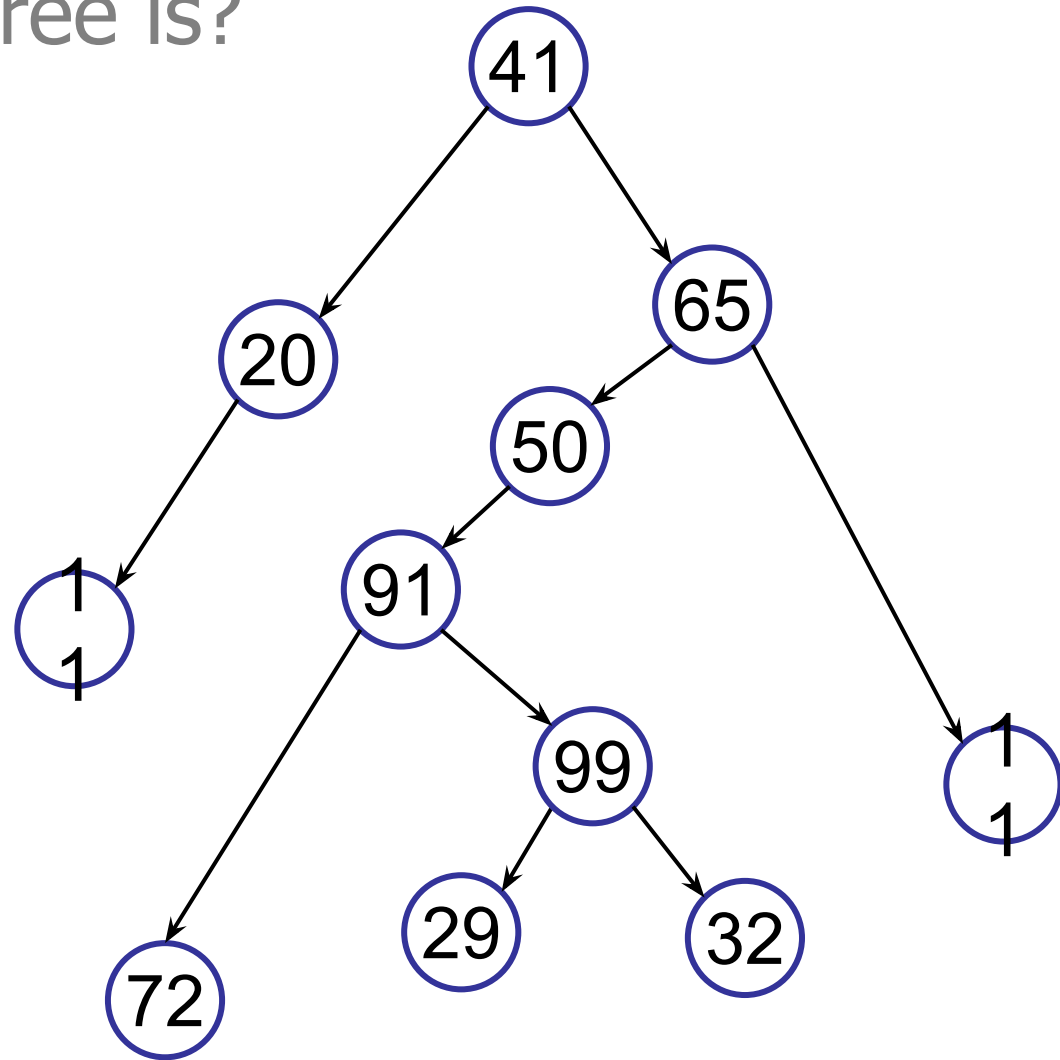
max of subtrees

add 1



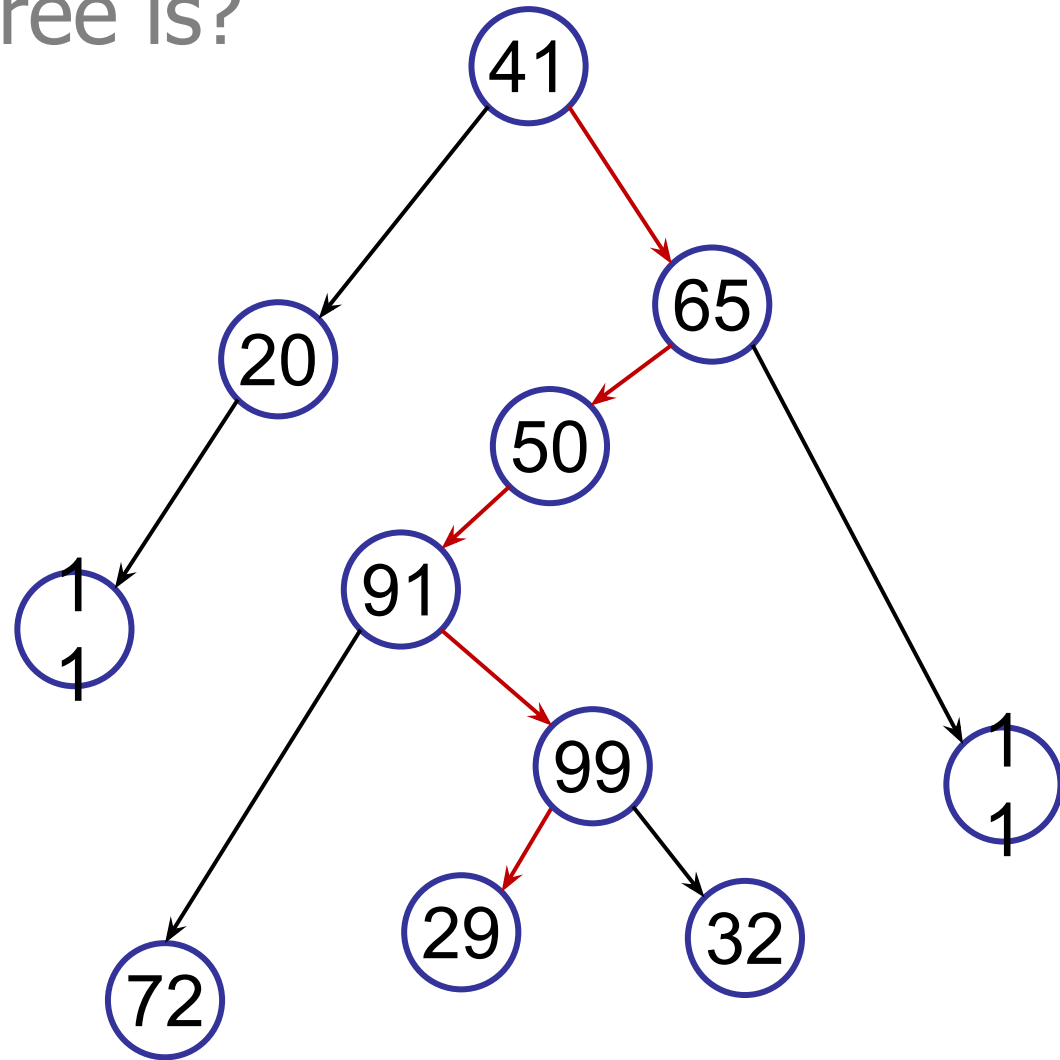
The height of this tree is?

1. 2
2. 4
3. 5
4. 6
5. 7
6. 42



The height of this tree is?

- 1. 2
- 2. 4
- ✓ 3. 5
- 4. 6
- 5. 7
- 6. 42




# Binary Search Trees

---

## 1. Terminology and Definitions

## 2. Basic operations:

- height
- searchMin, searchMax 
- search, insert

## 3. Traversals

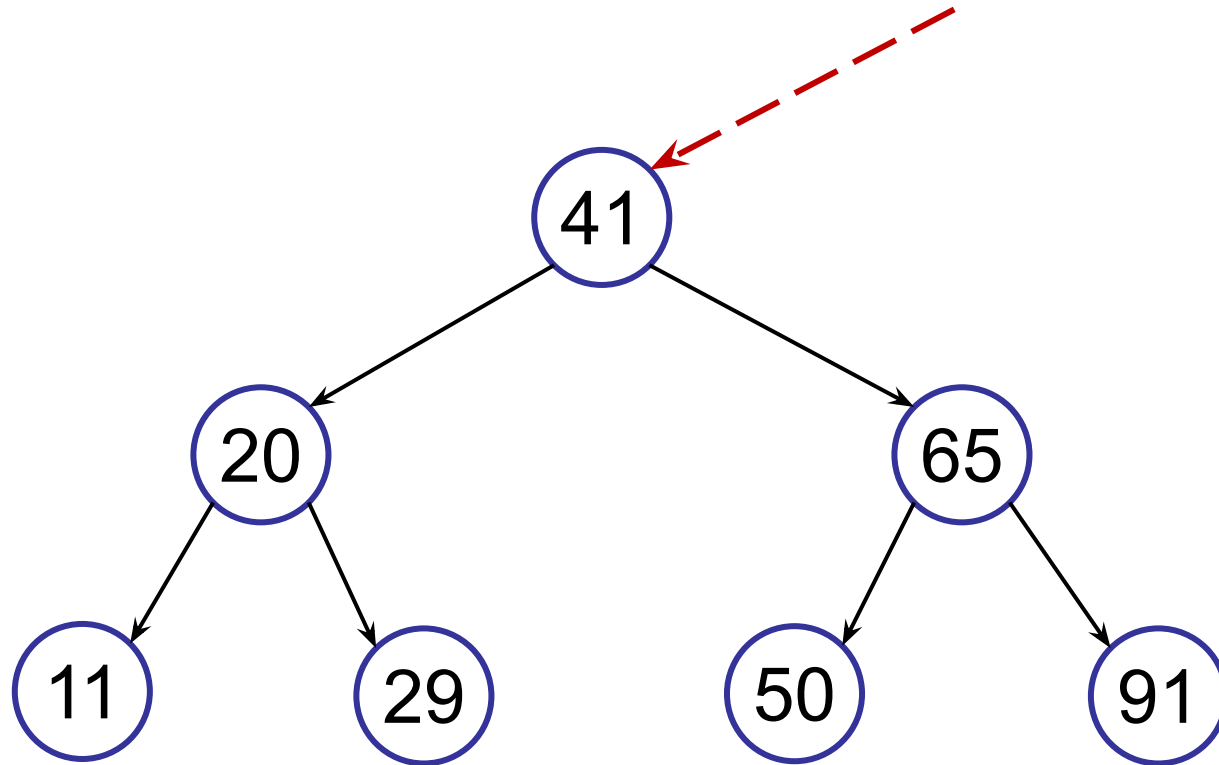
- in-order, pre-order, post-order

## 4. Other operations

# Binary Search Trees

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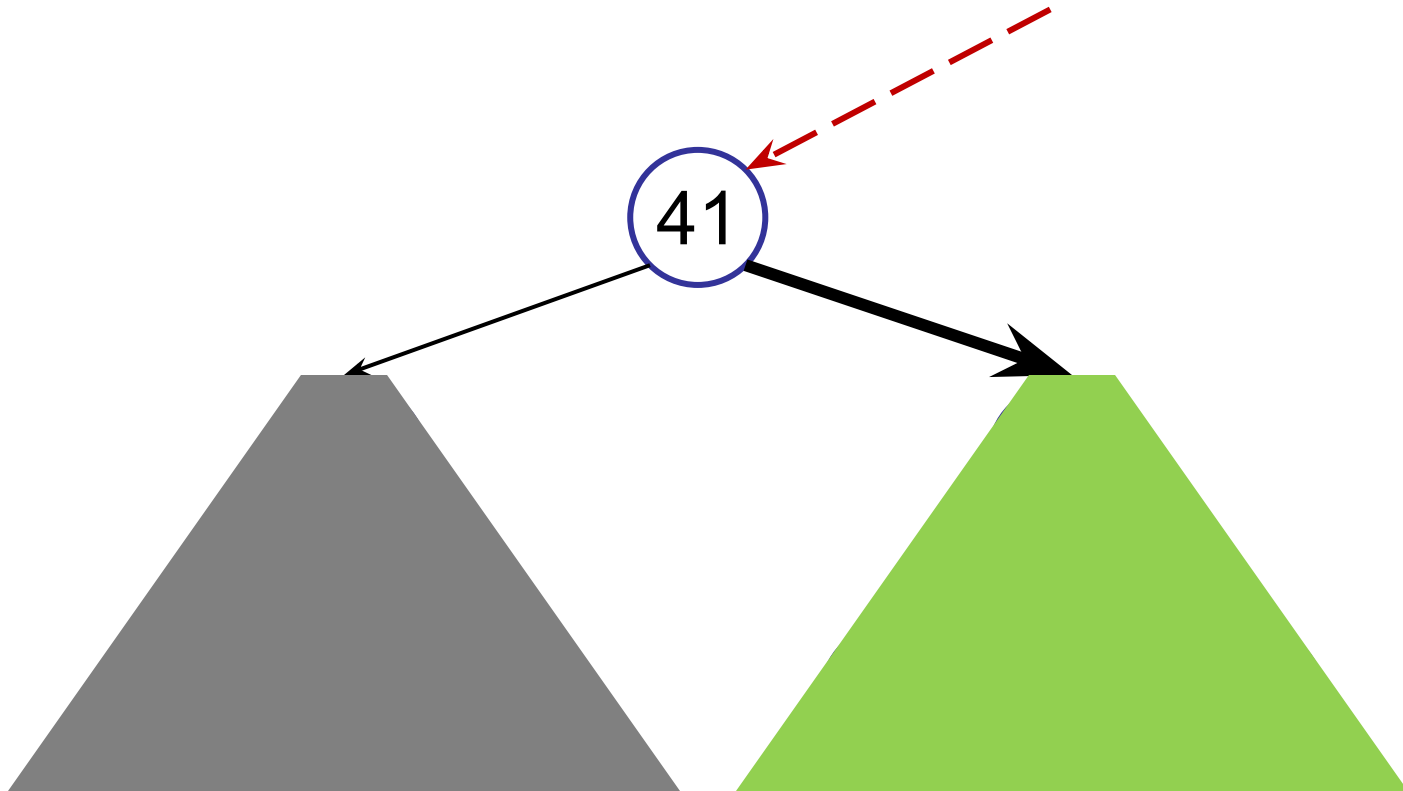
Search for the maximum key:



# Binary Search Trees

---

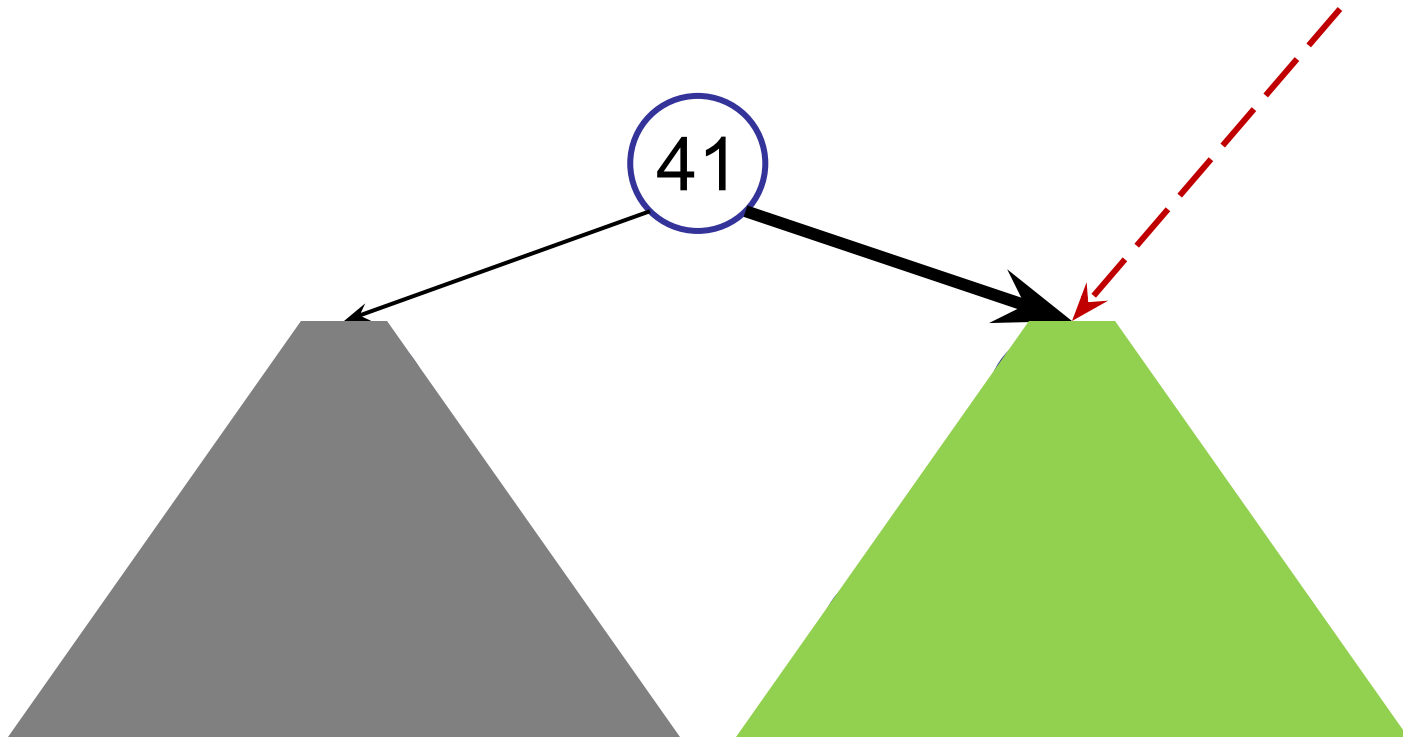
Search for the maximum key:



# Binary Search Trees

---

Search for maximum key



# Binary Tree

---

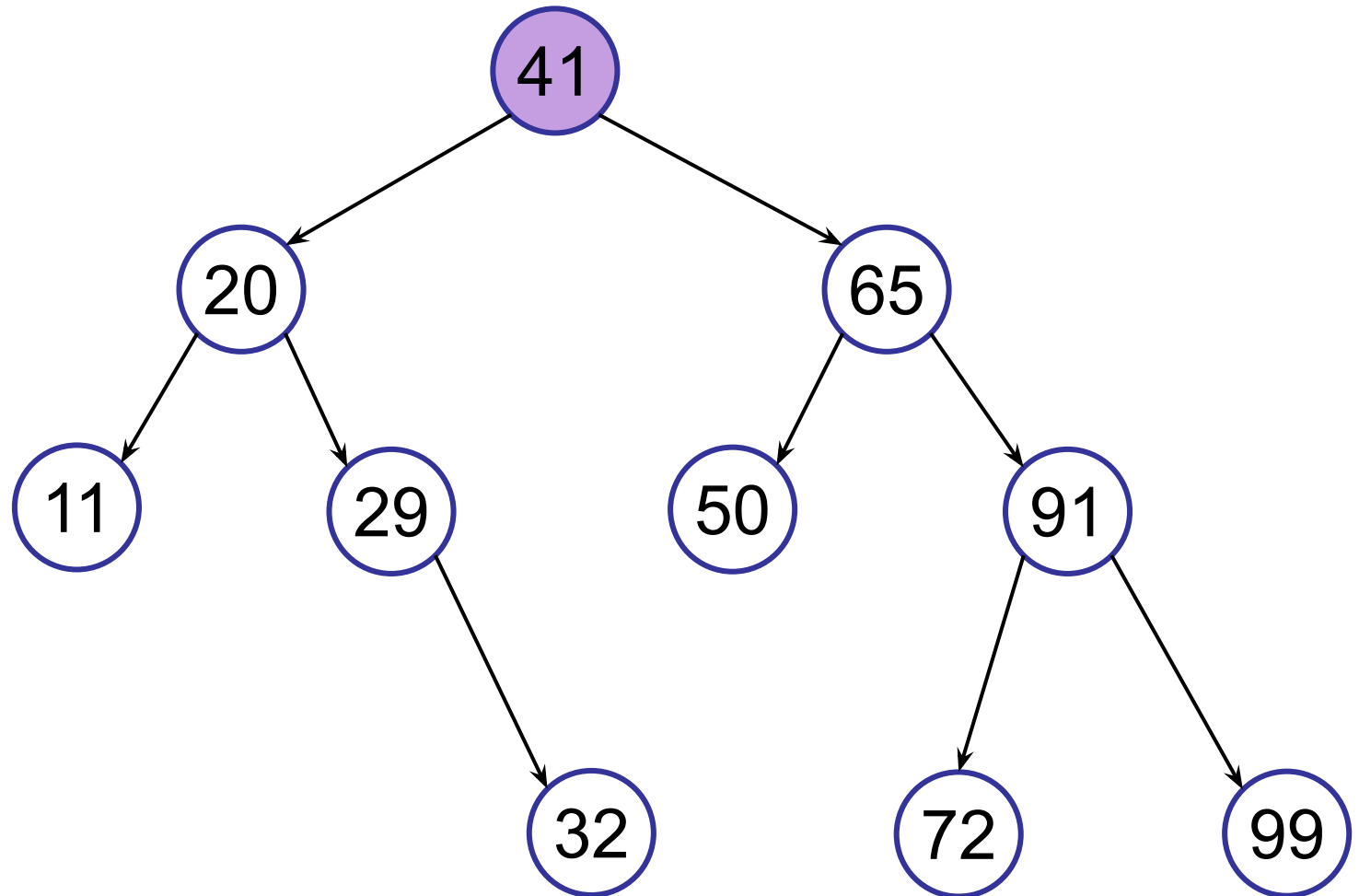
Searching for the node with the maximum key

```
public TreeNode searchMax() {  
    if (rightTree != null) {  
        return rightTree.searchMax();  
    }  
    else return this; // Key is here!  
}
```

# Binary Search Trees

---

searchMax()

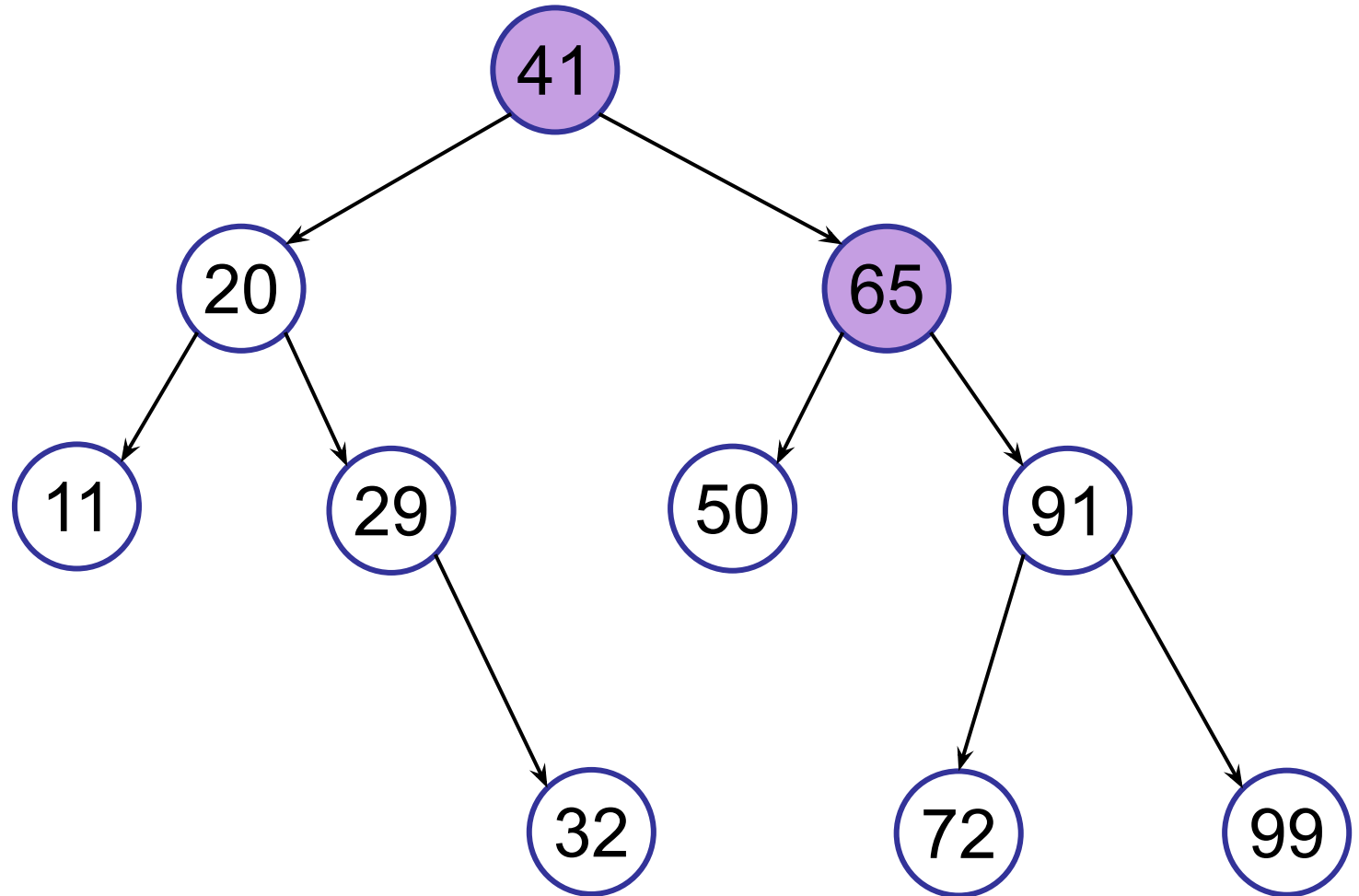




# Binary Search Trees

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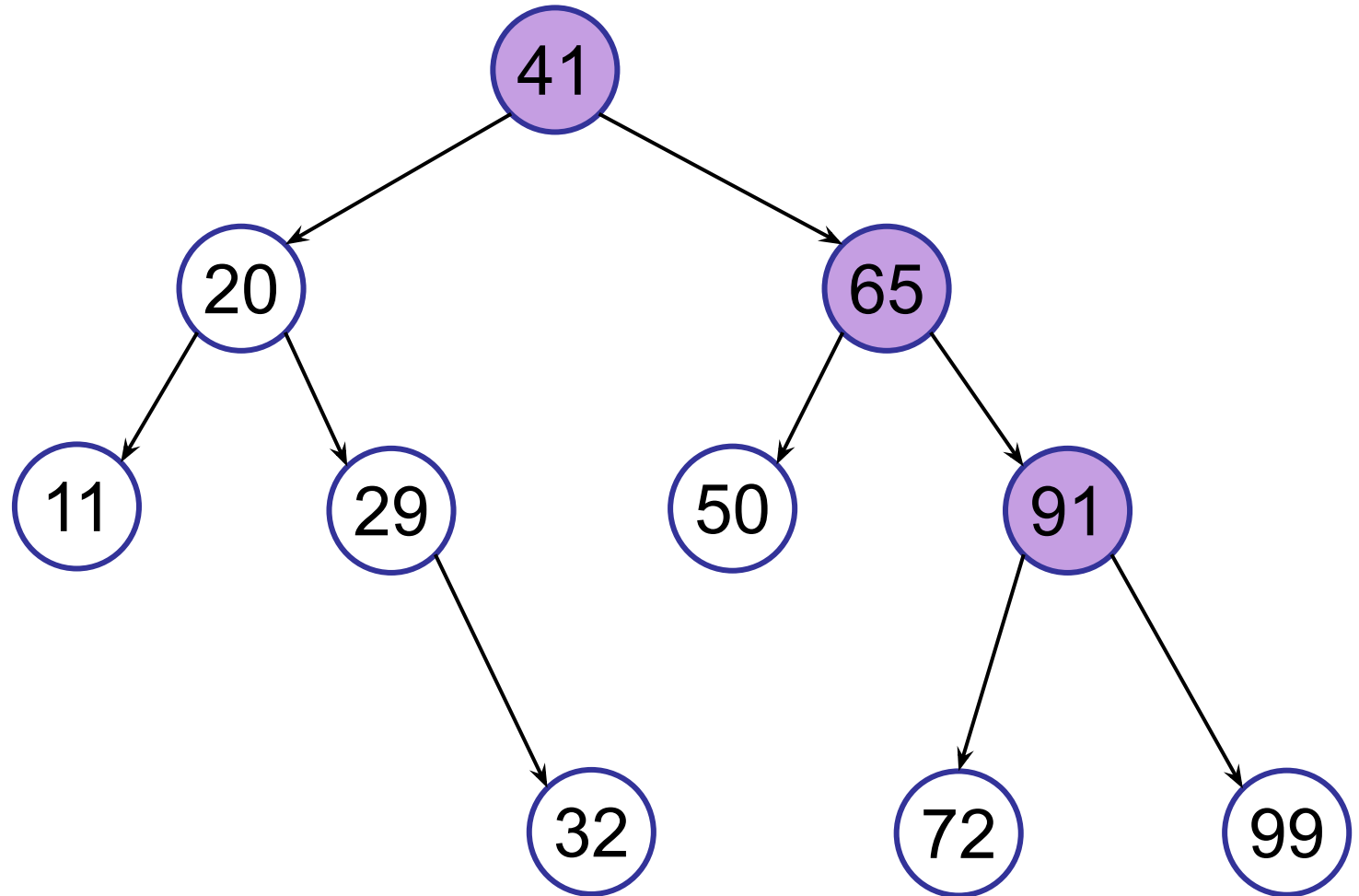
searchMax()



# Binary Search Trees

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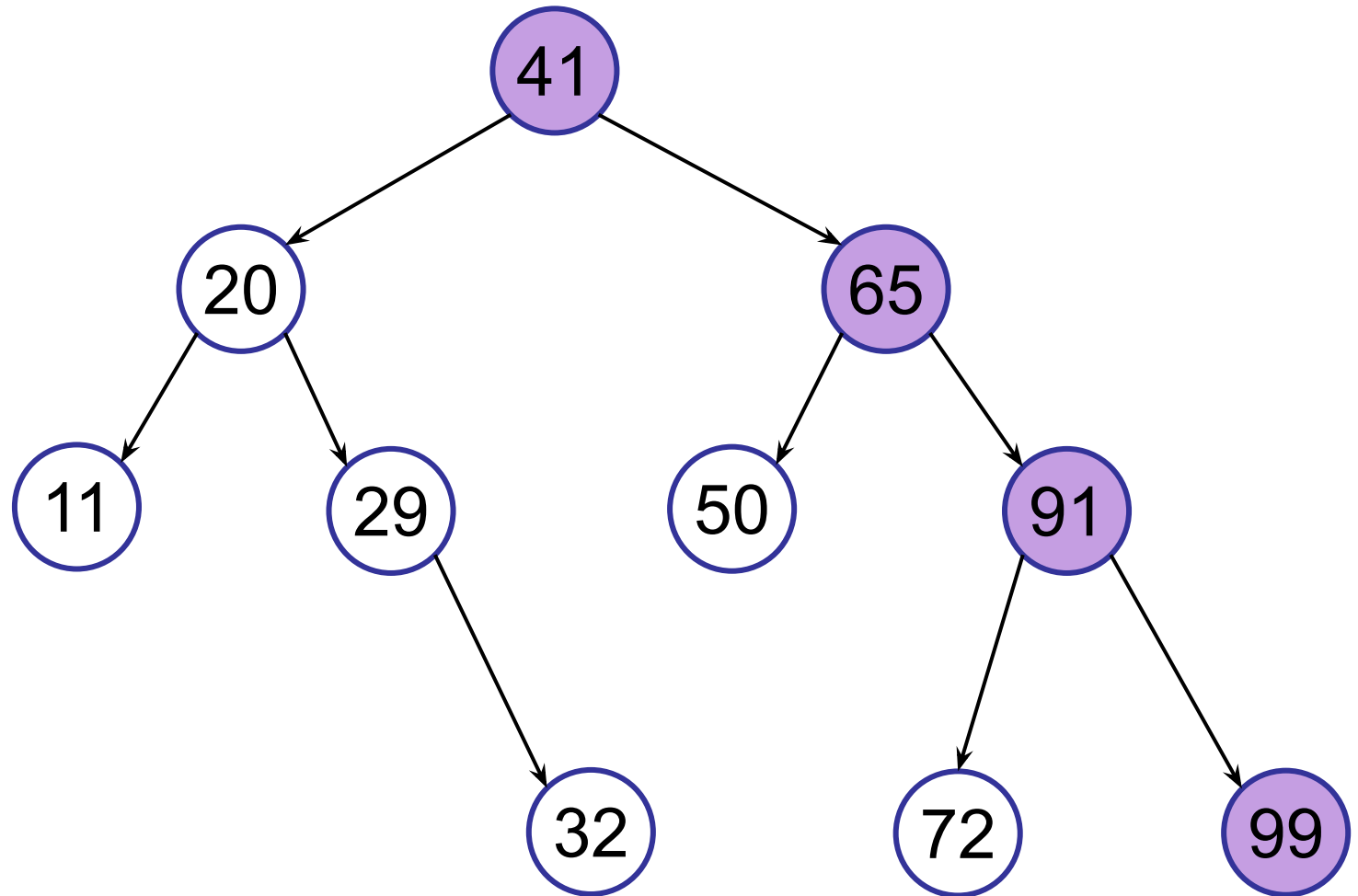
searchMax()



# Binary Search Trees

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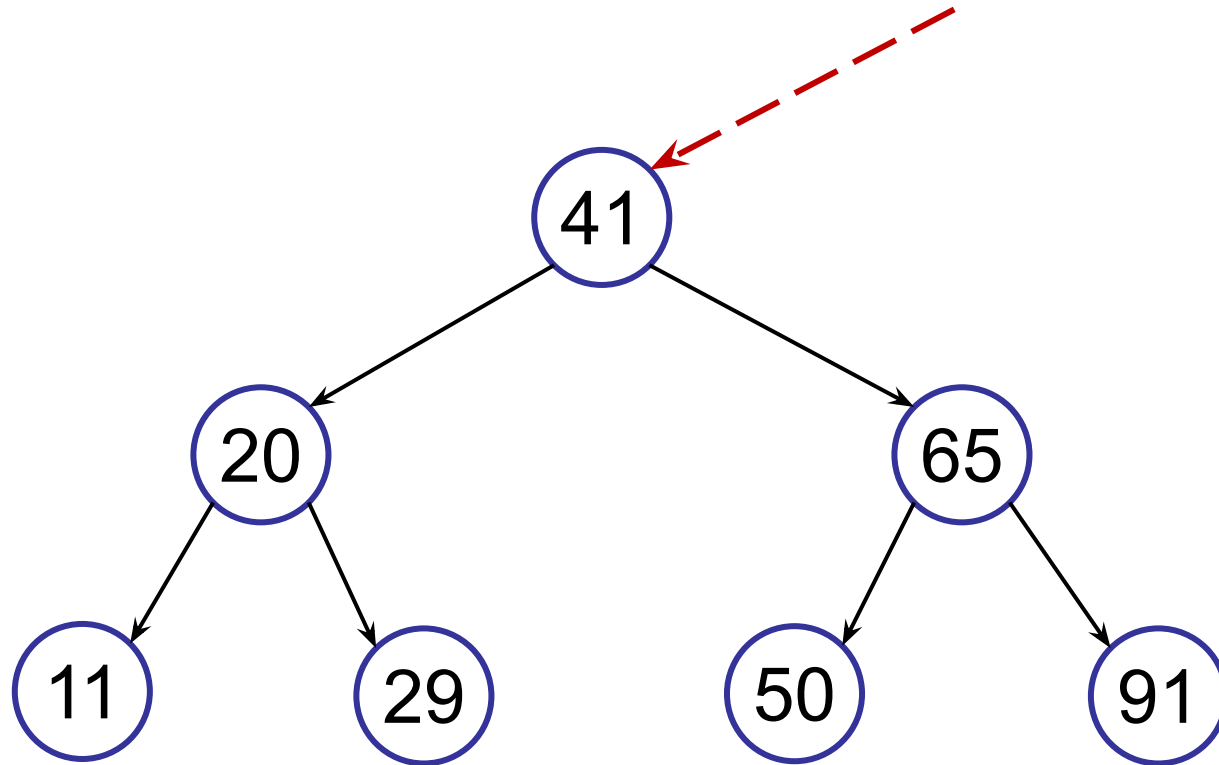
searchMax()



# Binary Search Trees

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Search for the minimum key:



# Binary Tree

---

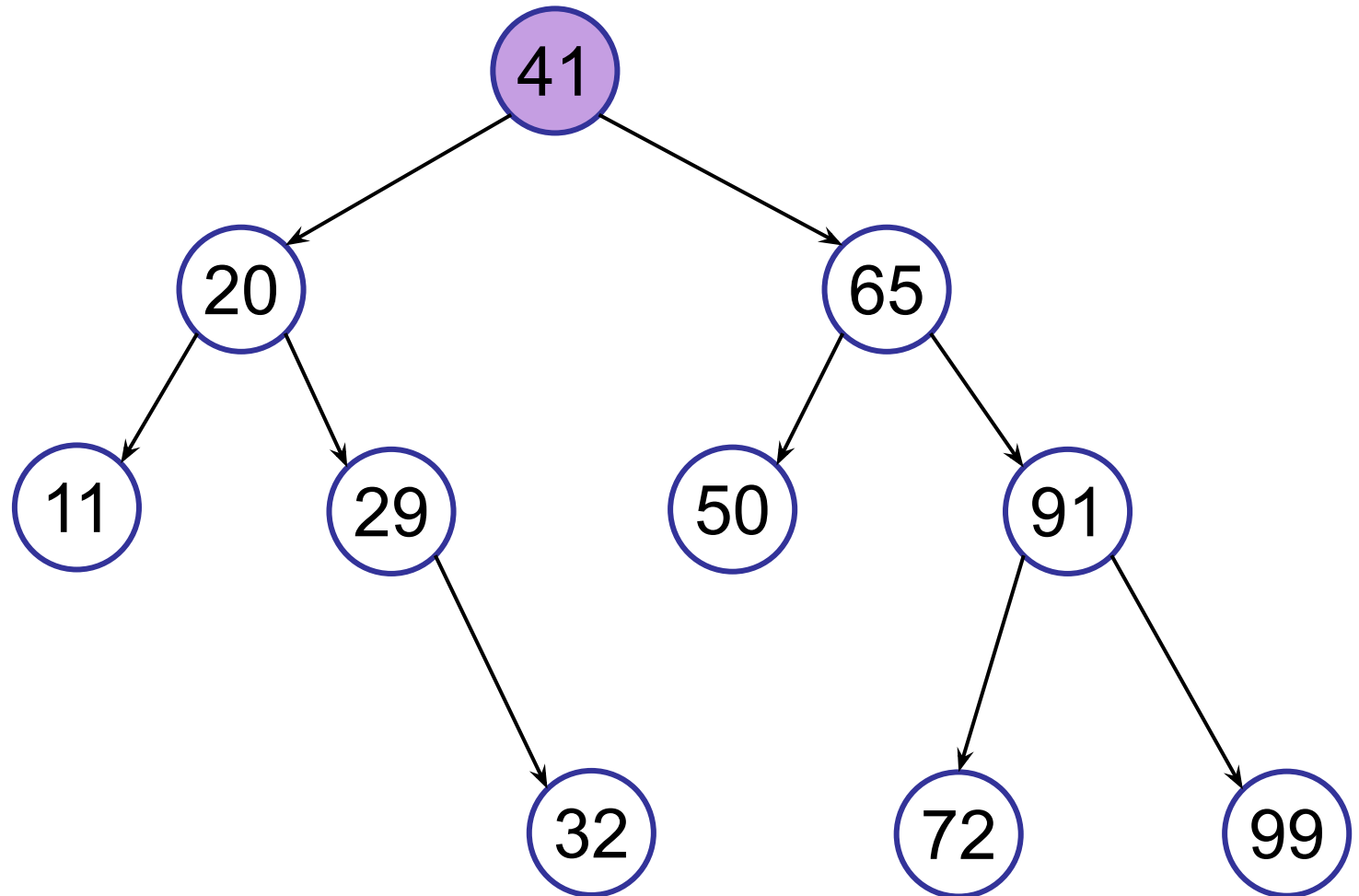
## Searching for the node with the minimum key

```
public TreeNode searchMin() {  
    if (leftTree != null) {  
        return leftTree.searchMin();  
    }  
    else return this; // Key is here!  
}
```

# Binary Search Trees

---

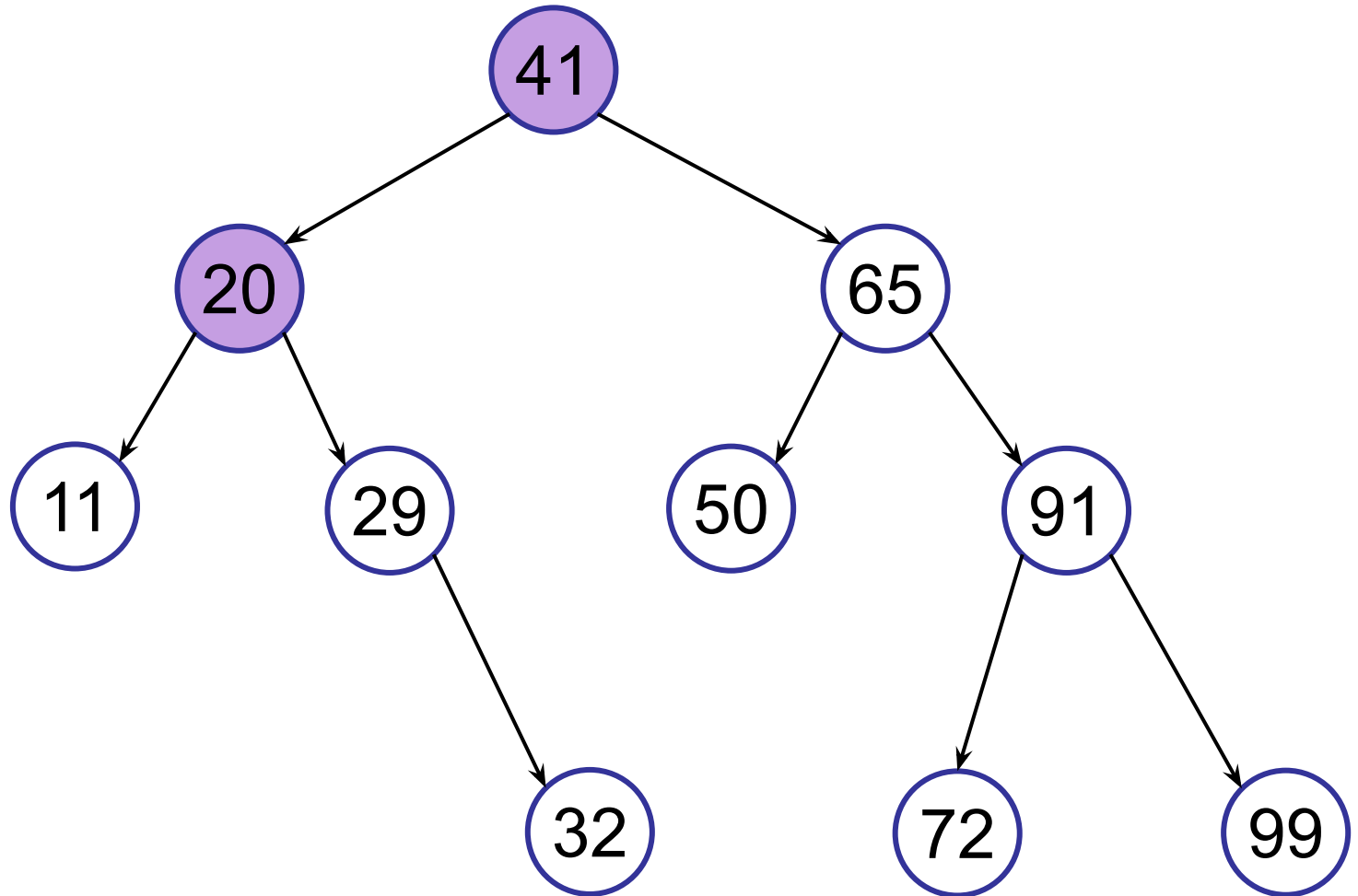
searchMin()



# Binary Search Trees

---

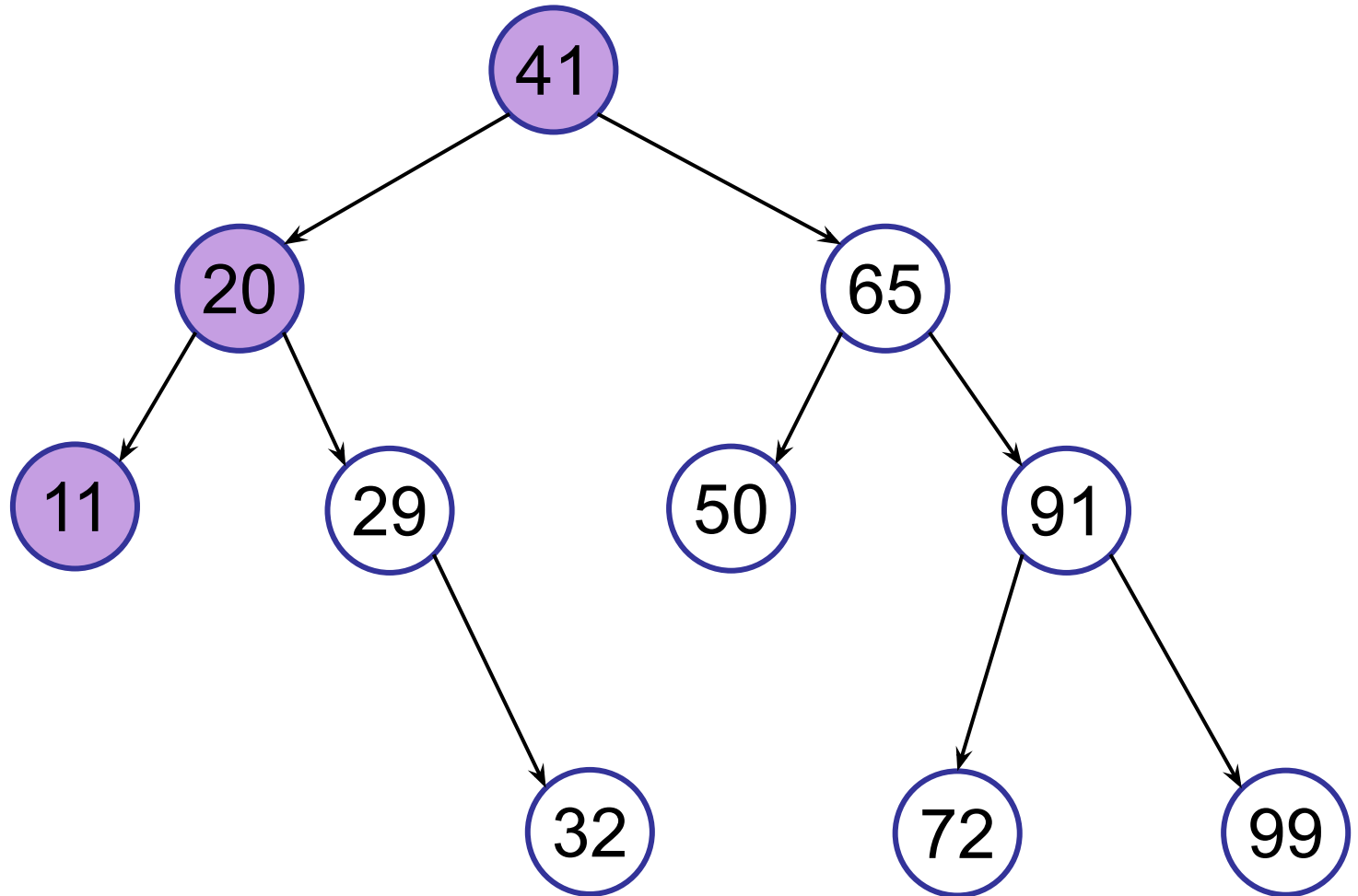
searchMin()



# Binary Search Trees

---

searchMin()






# Binary Search Trees

---

## 1. Terminology and Definitions

## 2. Basic operations:

- height
- searchMin, searchMax
- search, insert 

## 3. Traversals

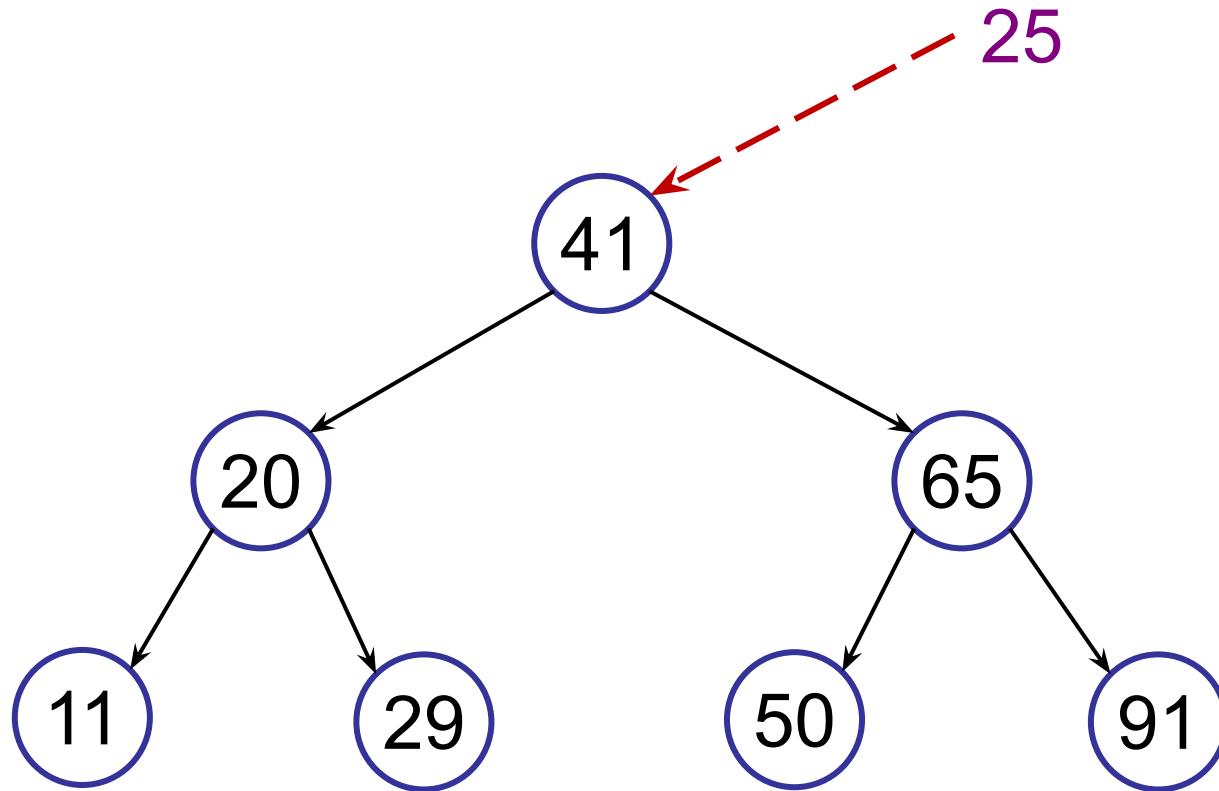
- in-order, pre-order, post-order

## 4. Other operations

# Binary Search Trees

---

Search for a key:

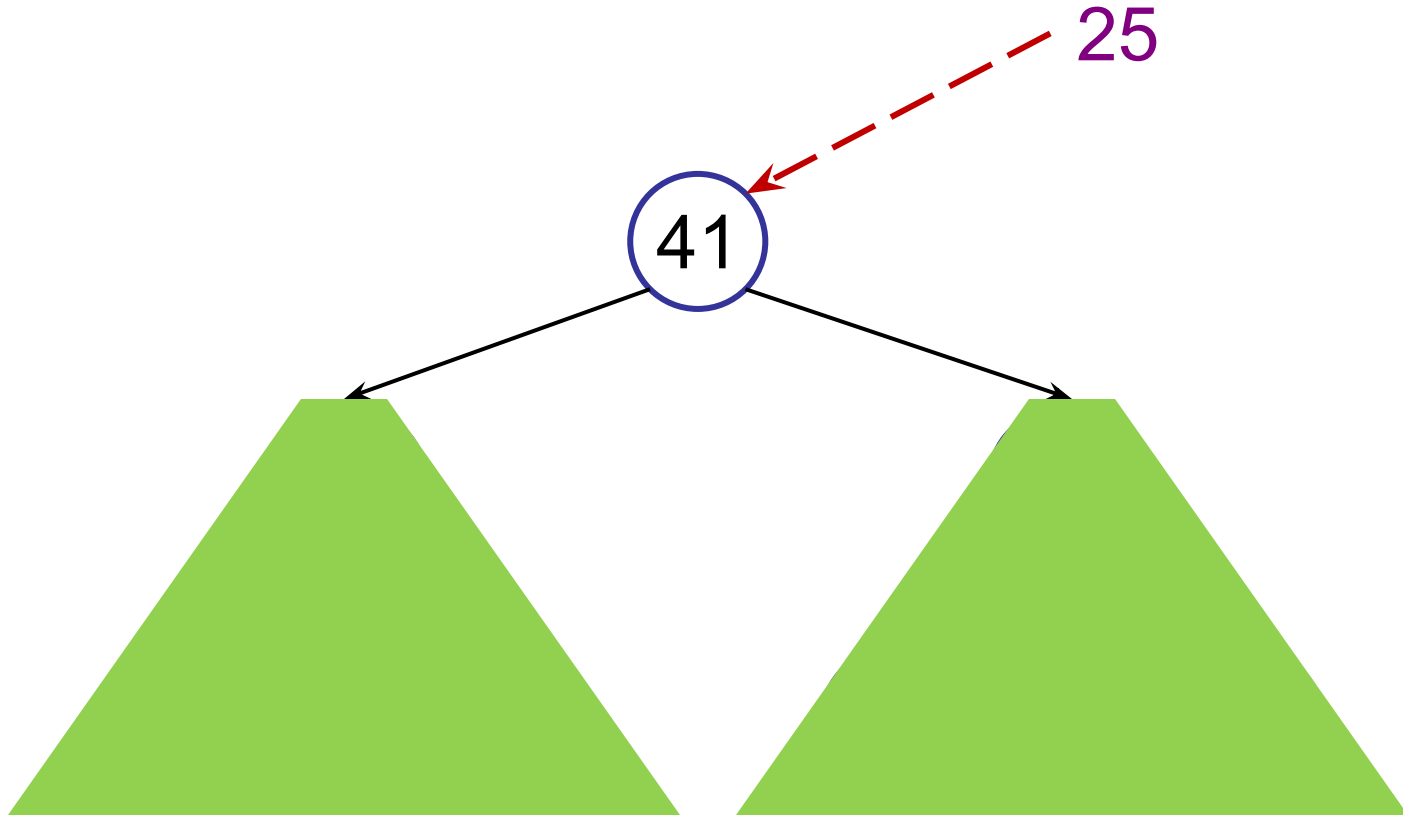


# Binary Search Trees

---

Search for a key:

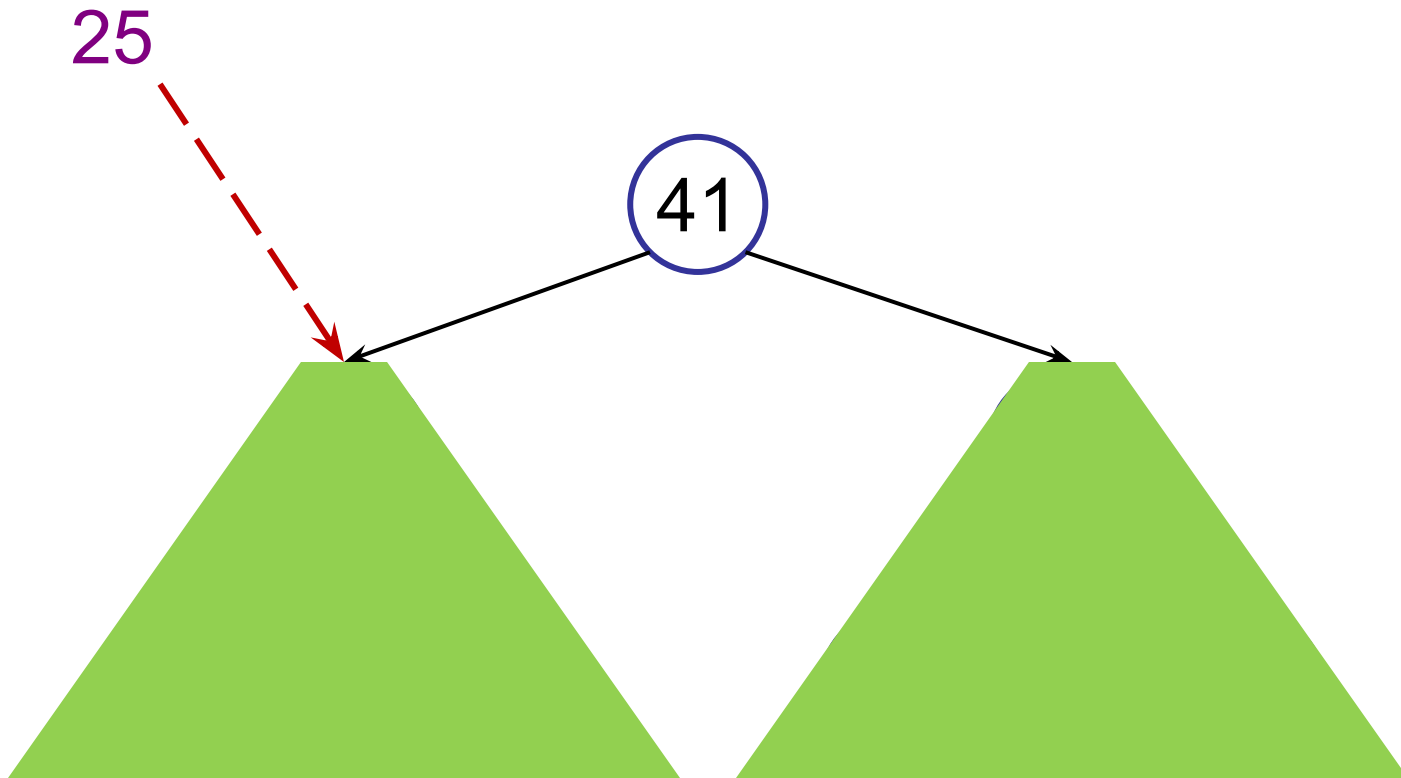
$25 < 41$



# Binary Search Trees

---

Search for a key:



# Binary Tree

---

## Inserting a new key

```
public TreeNode search(int queryKey){  
    if (queryKey < key) {  
        if (leftTree != null)  
            return leftTree.search(key);  
        else return null;  
    }  
    else if (queryKey > key) {  
        if (rightTree != null)  
            return rightTree.search(key);  
        else return null;  
    }  
    else return this; // Key is here!  
}
```

# Binary Tree

---

## Inserting a new key

```
public TreeNode search(int queryKey){  
    if (queryKey < key) {  
        if (leftTree != null)  
            return leftTree.search(key);  
        else return null;  
    }  
  
    else if (queryKey > key) {  
        if (rightTree != null)  
            return rightTree.search(key);  
        else return null;  
    }  
  
    else return this; // Key is here!  
}
```

# Binary Tree

---

## Inserting a new key

```
public TreeNode search(int queryKey) {  
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        else return null;  
    }  
    else if (queryKey > key) {  
        if (rightTree != null)  
            return rightTree.search(key);  
        else return null;  
    }  
    else return this; // Key is here!  
}
```

# Binary Tree

---

## Inserting a new key

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            return rightTree.search(key);  
        else return null;  
    }  
    else return this; // Key is here!  
}
```



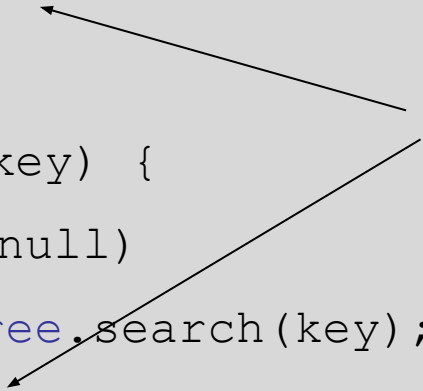
# Binary Tree

---

## Inserting a new key

```
public TreeNode search(int queryKey) {  
    if (queryKey < key) {  
        if (leftTree != null)  
            return leftTree.search(key);  
        else return null;  
    }  
    else if (queryKey > key) {  
        if (rightTree != null)  
            return rightTree.search(key);  
        else return null;  
    }  
    else return this; // Key is here!  
}
```

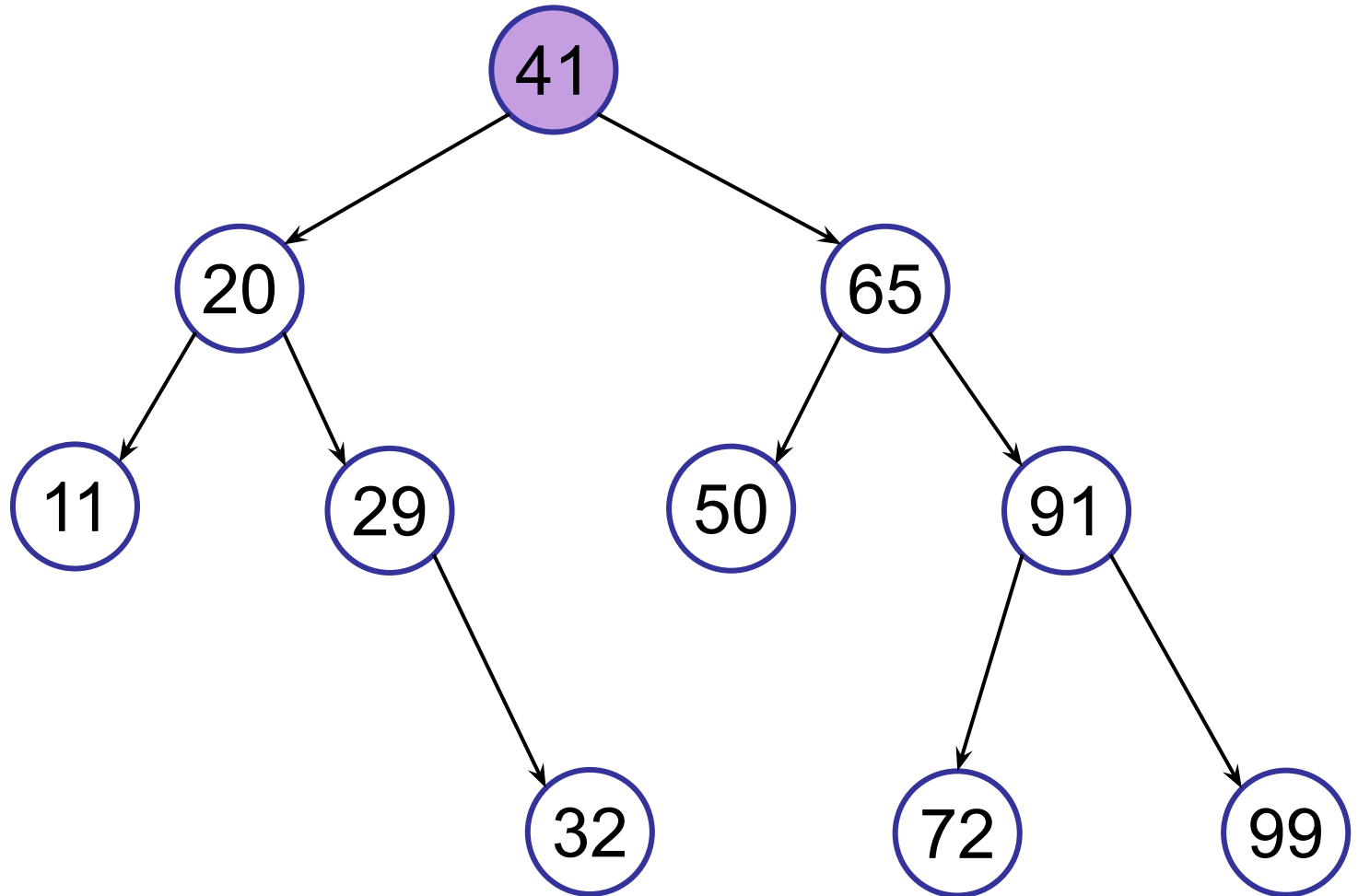
If we have no more sub-tree to recurse on, the key doesn't exist.



# Binary Search Trees

---

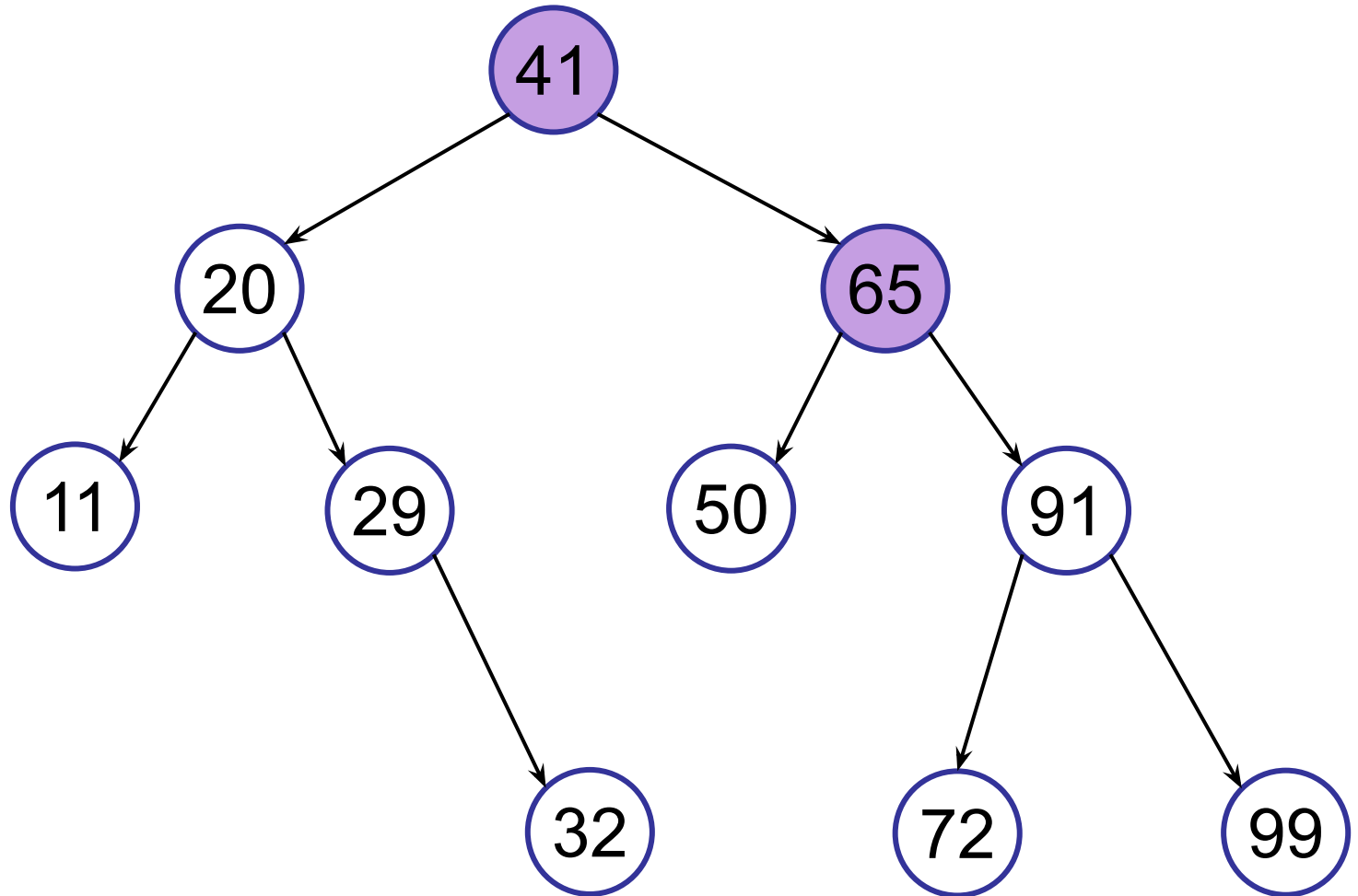
search(72)



# Binary Search Trees

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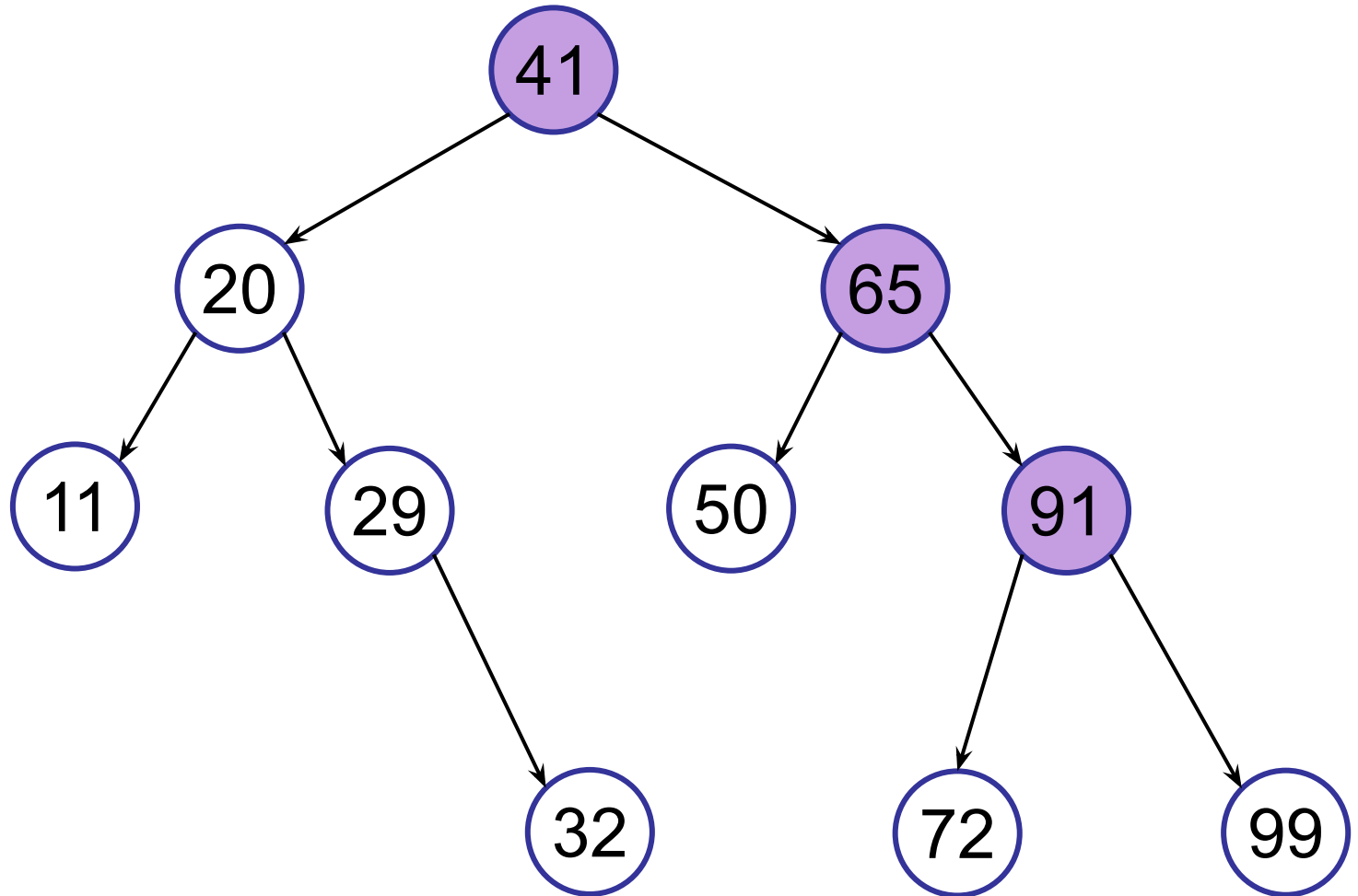
search(72)



# Binary Search Trees

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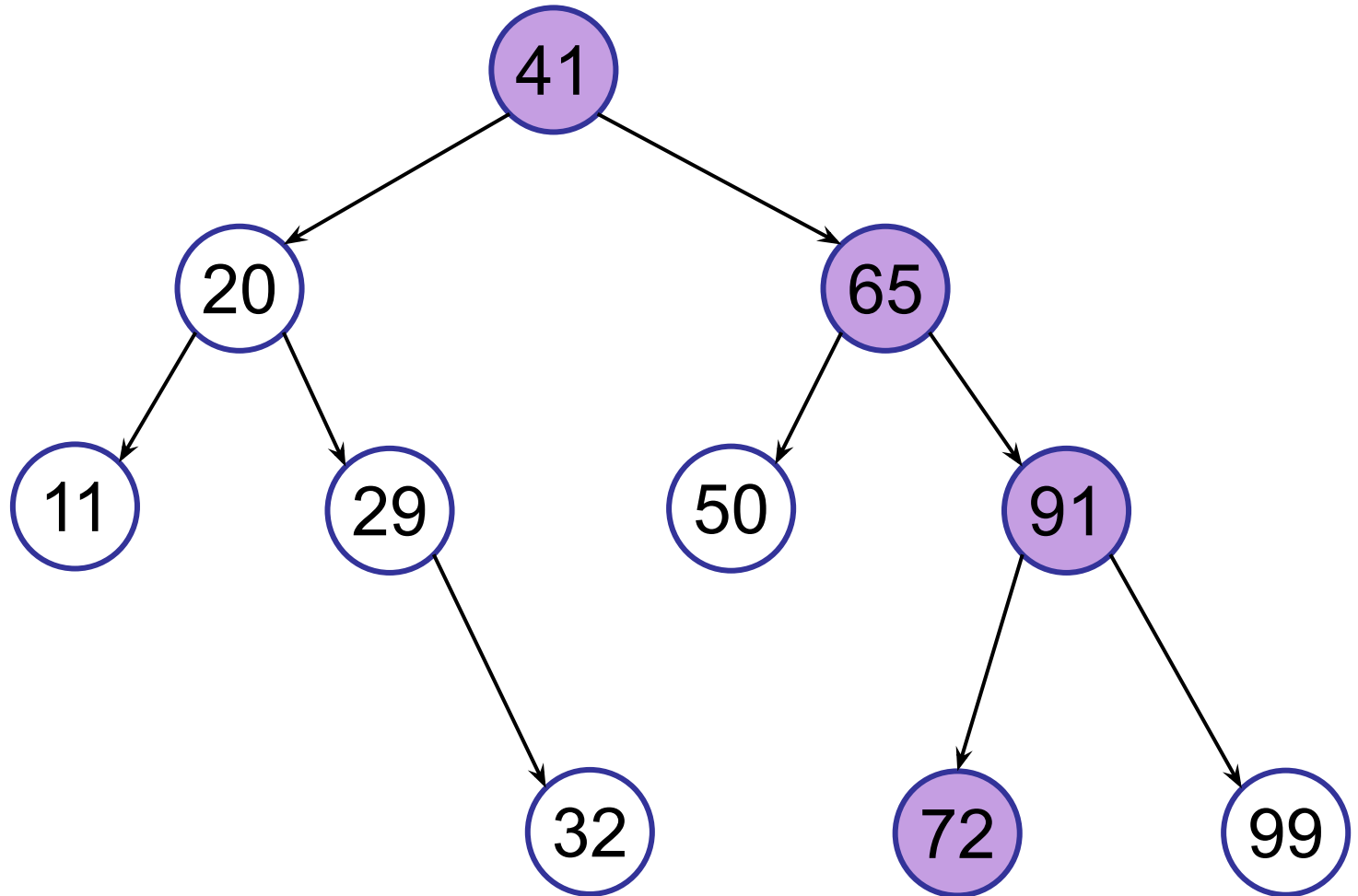
search(72)



# Binary Search Trees

---

search(72)




# Binary Search Trees

---

## 1. Terminology and Definitions

## 2. Basic operations:

- height
- searchMin, searchMax
- search, insert 

## 3. Traversals

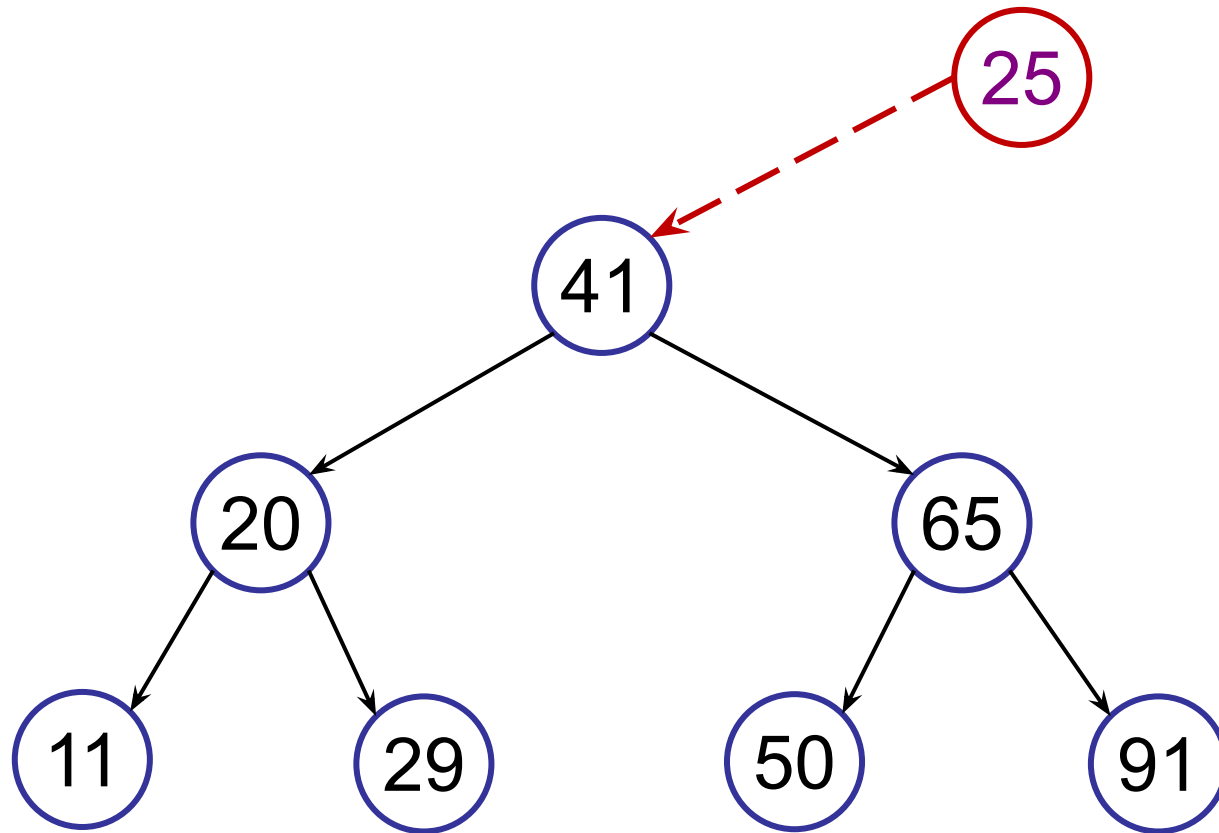
- in-order, pre-order, post-order

## 4. Other operations

# Binary Search Trees

---

Inserting a new key:

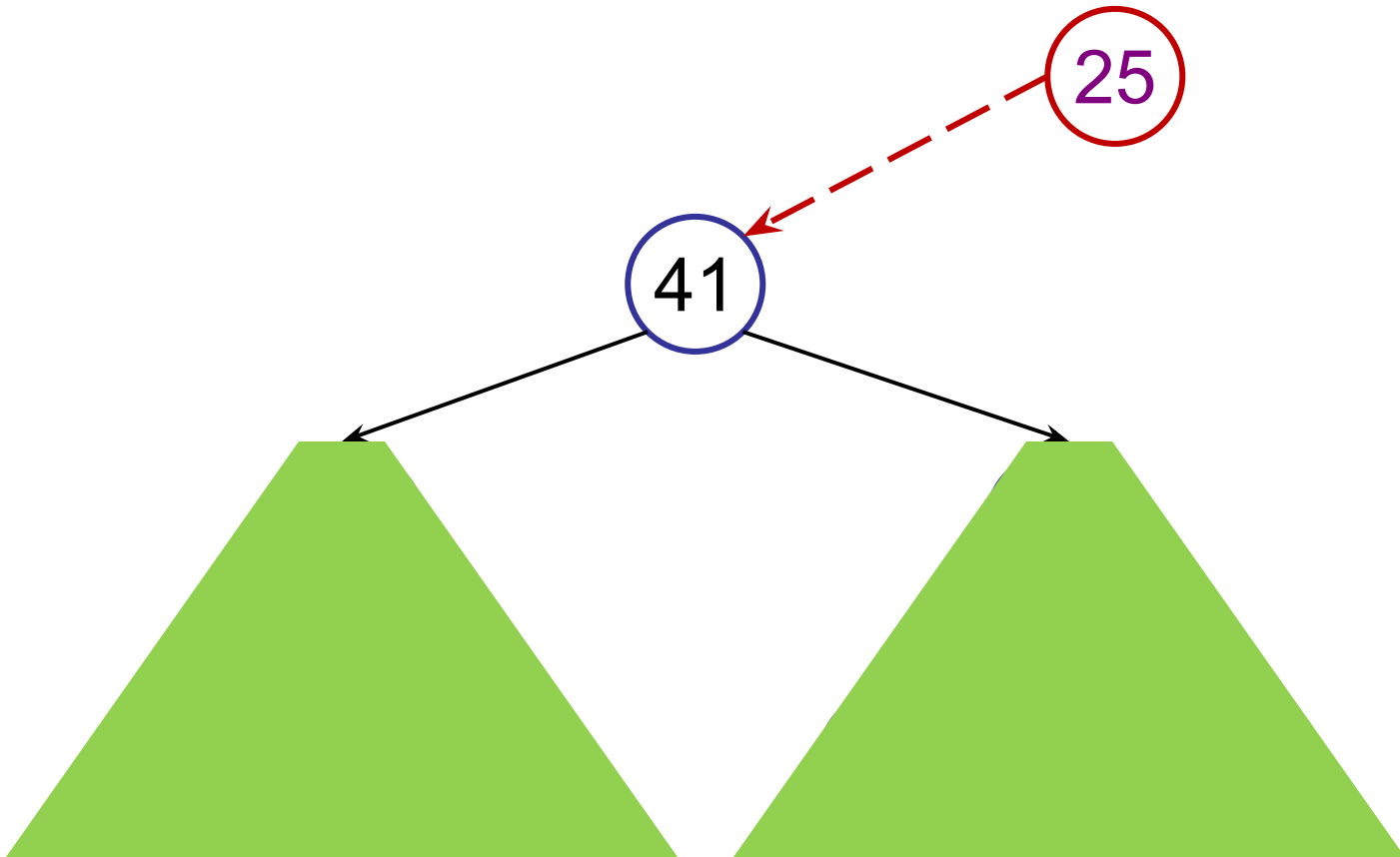


# Binary Search Trees

---

$25 < 41$

Inserting a new key:

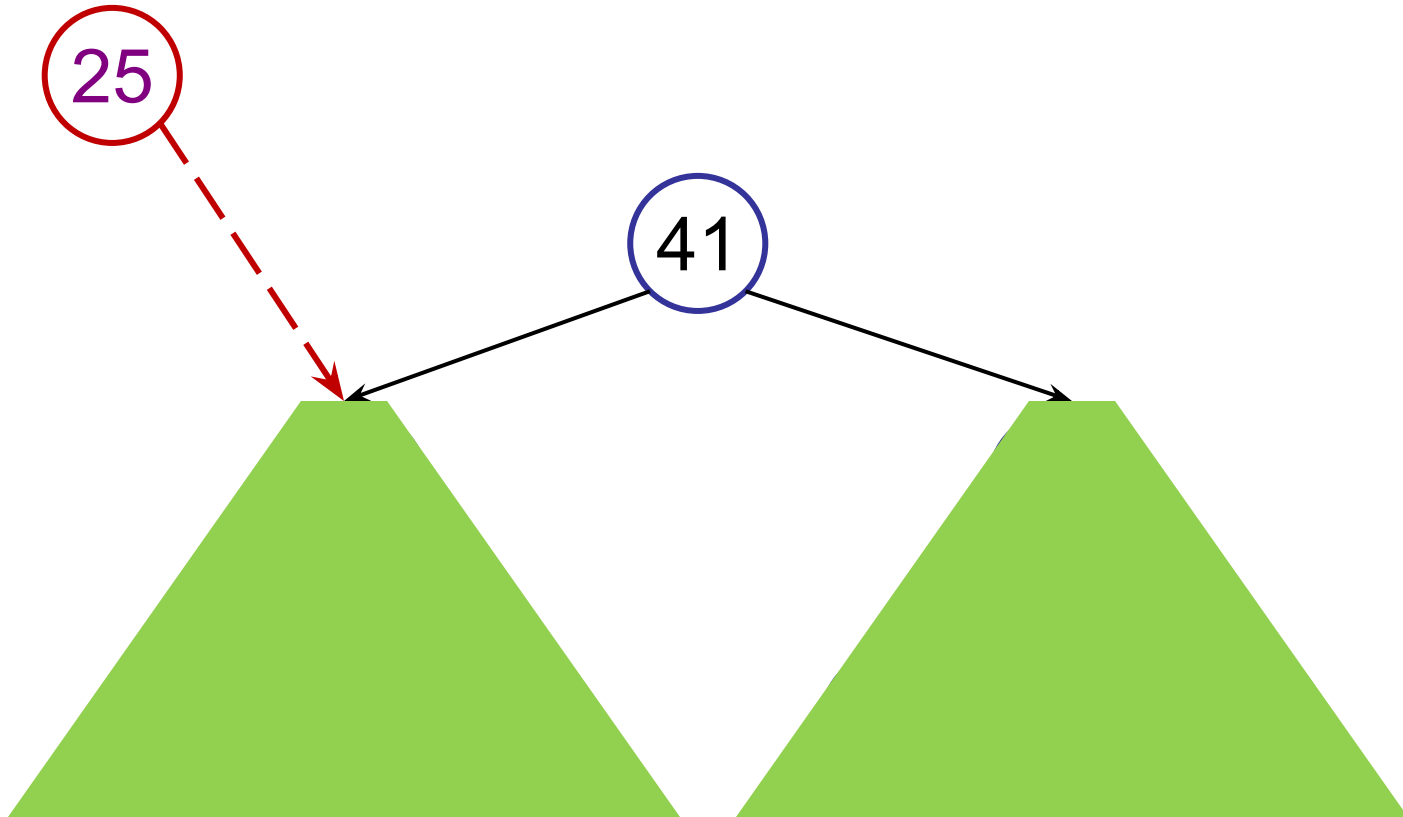




# Binary Search Trees

---

Inserting a new key:



# Binary Tree

---

## Inserting a new key

```
public void insert(int insKey, int intValue){  
    if (insKey < key) {  
        if (leftTree != null)  
            leftTree.insert(insKey);  
        else leftTree = new TreeNode(insKey, intValue);  
    }  
    else if (insKey > key) {  
        if (rightTree != null)  
            rightTree.insert(insKey);  
        else rightTree = new TreeNode(insKey, intValue);  
    }  
    else return; // Key is already in the tree!  
}
```

# Binary Tree

---

## Inserting a new key

```
public void insert(int insKey, int intValue){  
    if (insKey < key) {  
        if (leftTree != null)  
            leftTree.insert(insKey);  
        else leftTree = new TreeNode(insKey, intValue);  
    }  
    else if (insKey > key) {  
        if (rightTree != null)  
            rightTree.insert(insKey);  
        else rightTree = new TreeNode(insKey, intValue);  
    }  
    else return; // Key is already in the tree!  
}
```

# Binary Tree

---

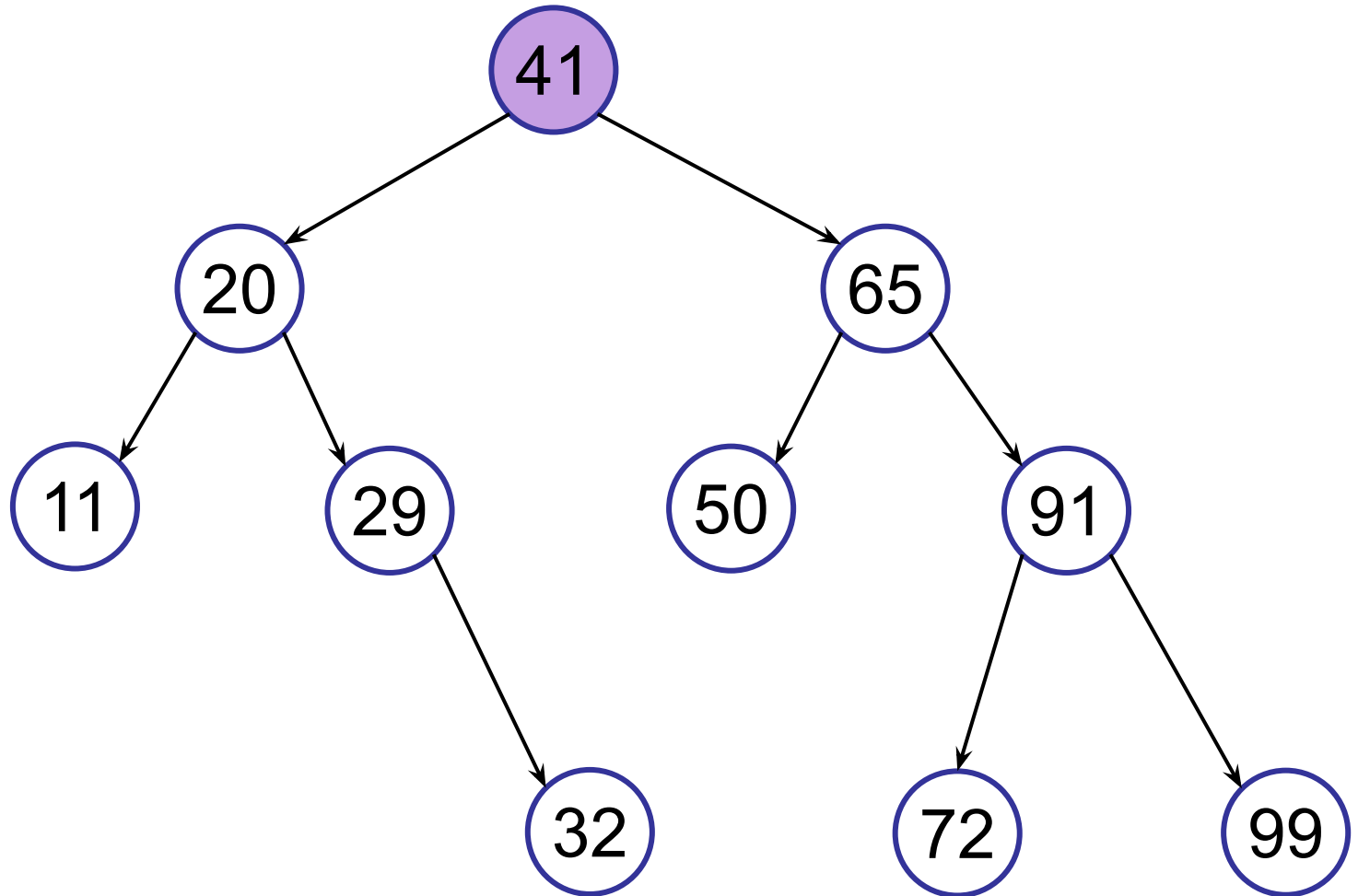
## Inserting a new key

```
public void insert(int insKey, int intValue){  
    if (insKey < key) {  
        if (leftTree != null)  
            leftTree.insert(insKey);  
        else leftTree = new TreeNode(insKey, intValue);  
    }  
    else if (insKey > key) {  
        if (rightTree != null)  
            rightTree.insert(insKey);  
        else rightTree = new TreeNode(insKey, intValue);  
    }  
    else return; // Key is already in the tree!  
}
```

# Binary Search Trees

---

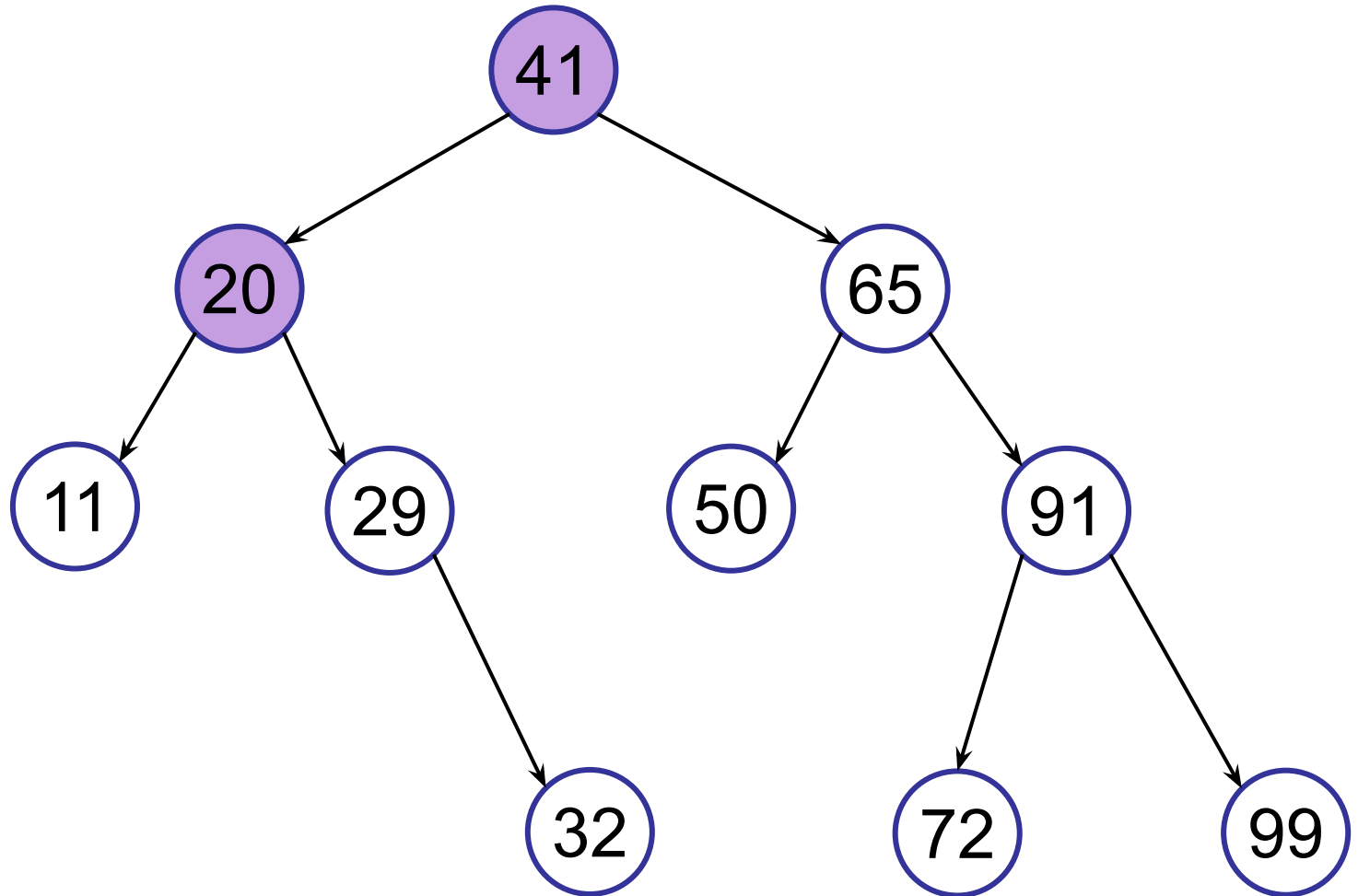
insert(27)



# Binary Search Trees

---

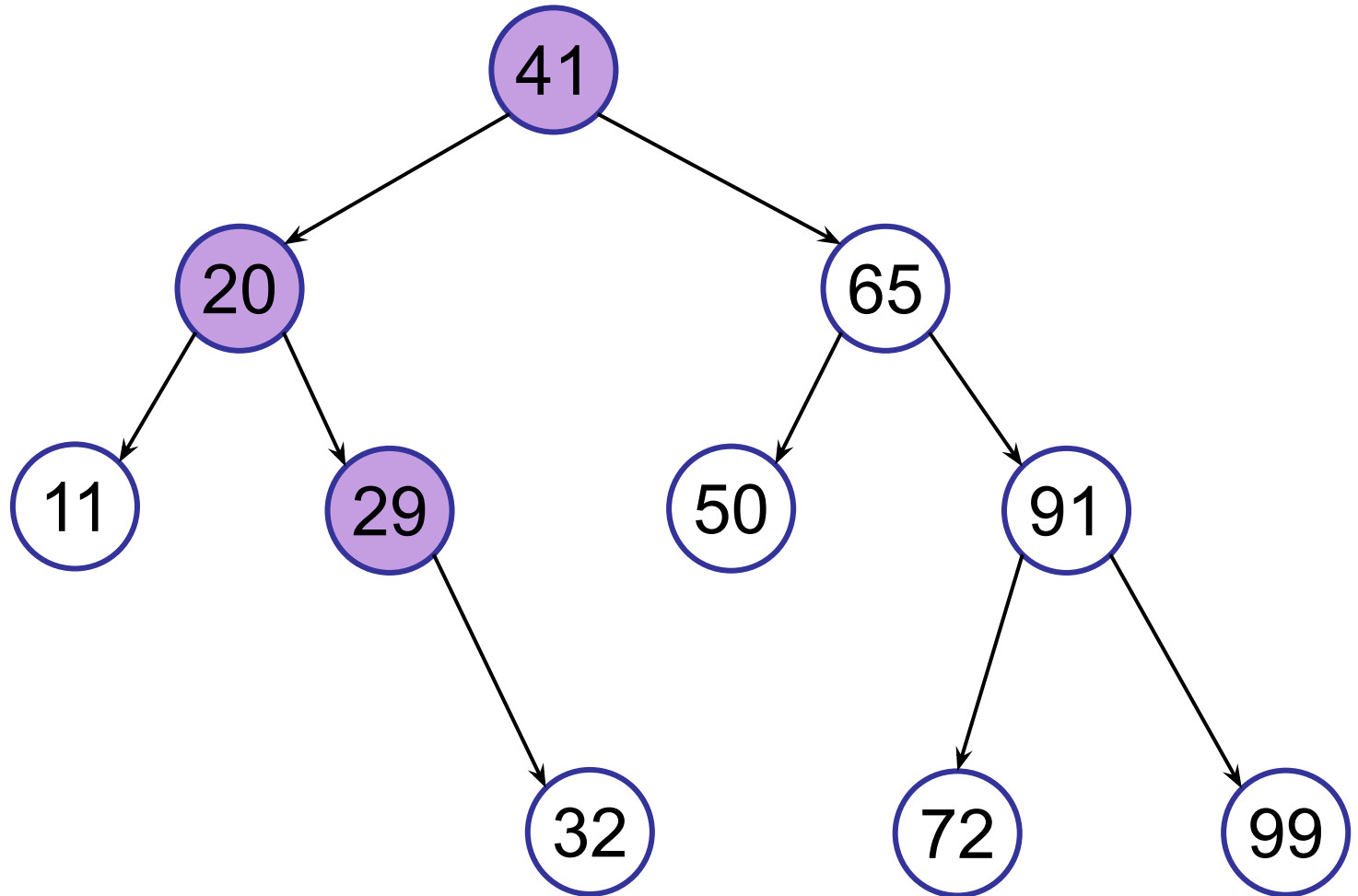
insert(27)



# Binary Search Trees

---

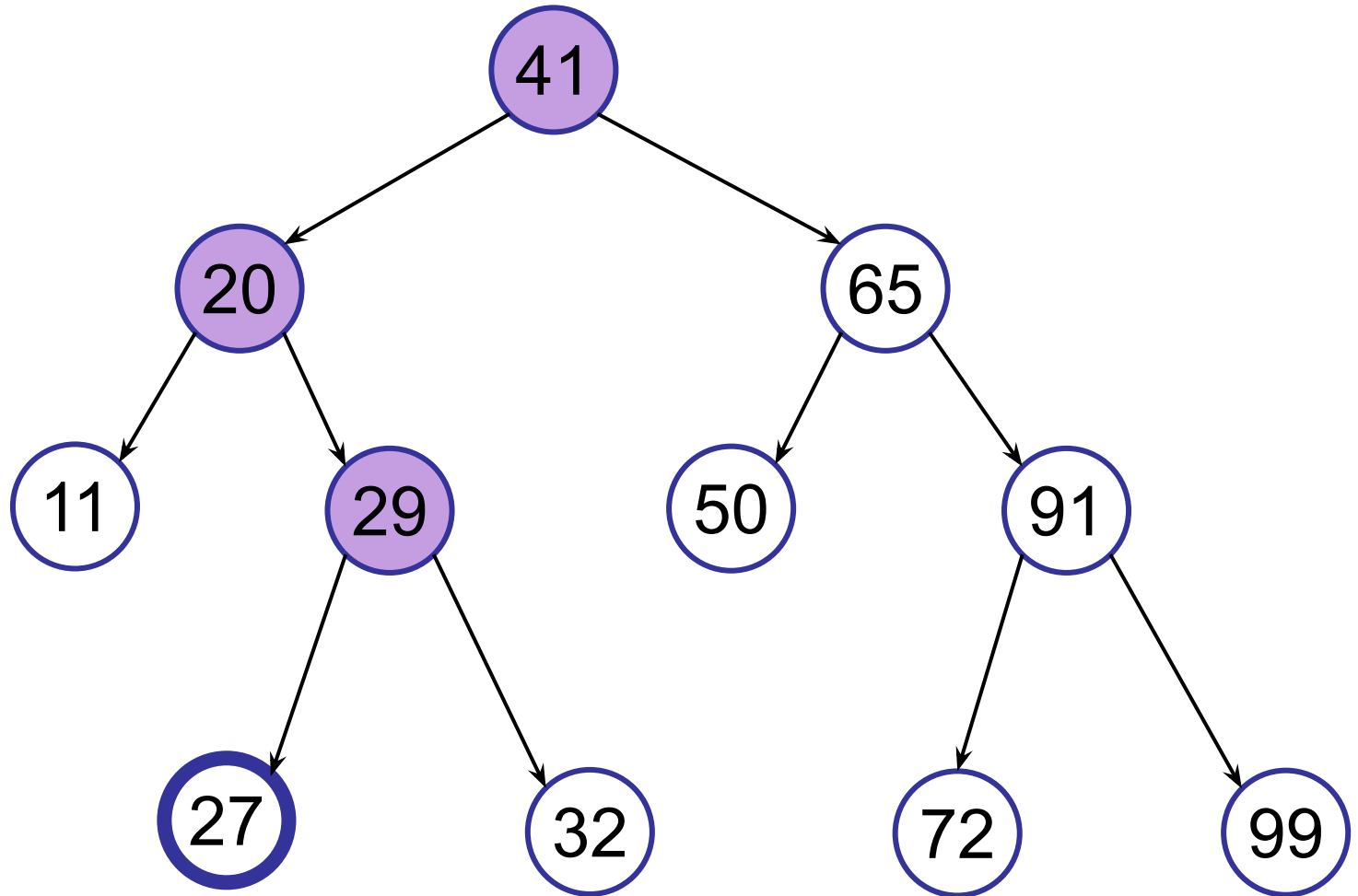
insert(27)



# Binary Search Trees

---

insert(27)





# Binary Search Tree

---

What is the worst-case running time of **search** in a BST?

1.  $O(1)$
2.  $O(\log n)$
3.  $O(n)$
4.  $O(n^2)$
5.  $O(n^3)$
6.  $O(2^n)$

# Binary Search Tree

---

What is the worst-case running time of **search** in a BST?

1.  $O(1)$
2.  $O(\log n)$
3.  $O(n)$
4.  $O(n^2)$
5.  $O(n^3)$
6.  $O(2^n)$

# Binary Search Tree

---

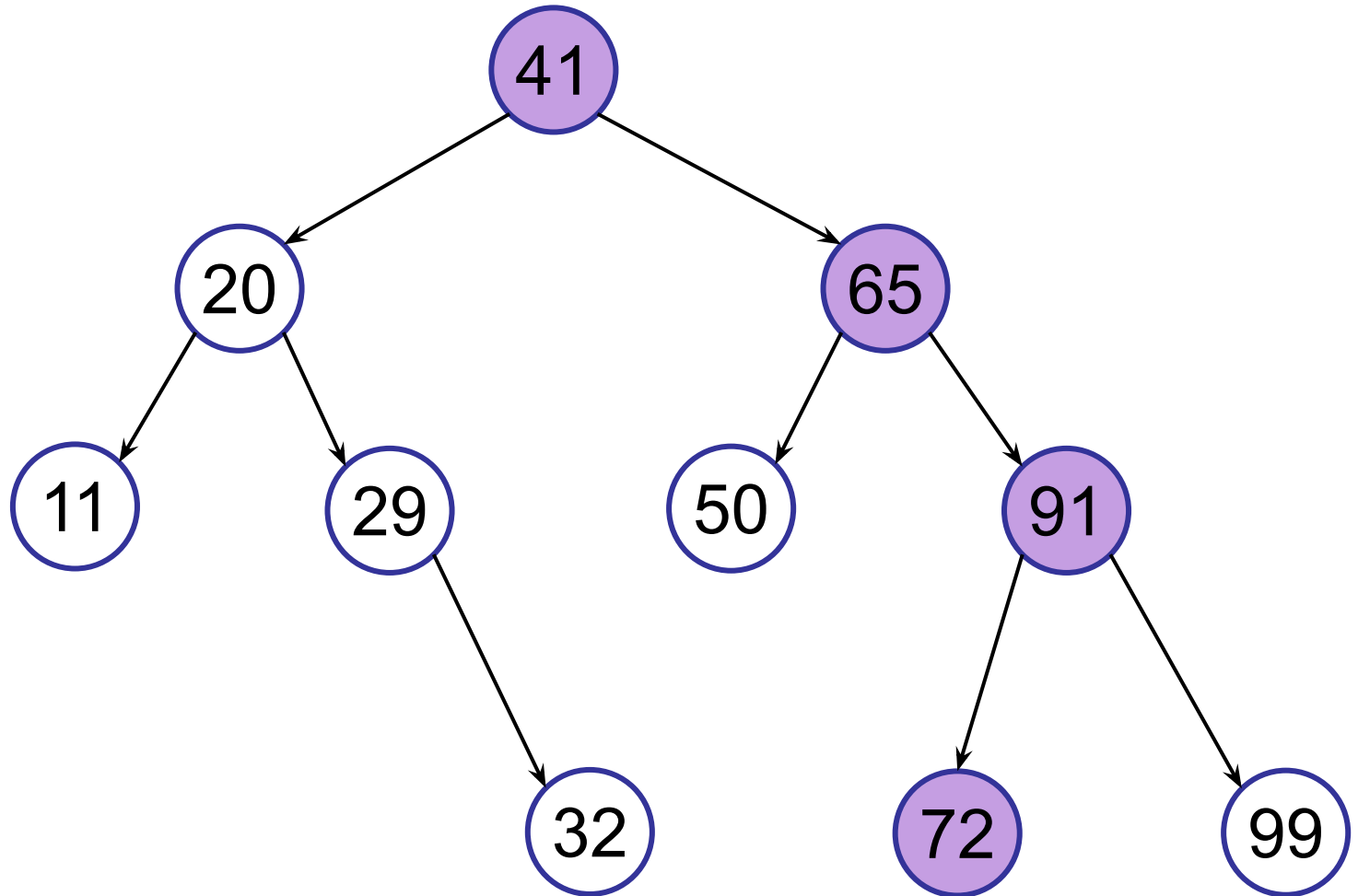
What is the worst-case running time of **search** in a BST?

1.  $O(1)$
2.  $O(\log n)$  ???
3.  $O(n)$
4.  $O(n^2)$
5.  $O(n^3)$
6.  $O(2^n)$

# Binary Search Trees

---

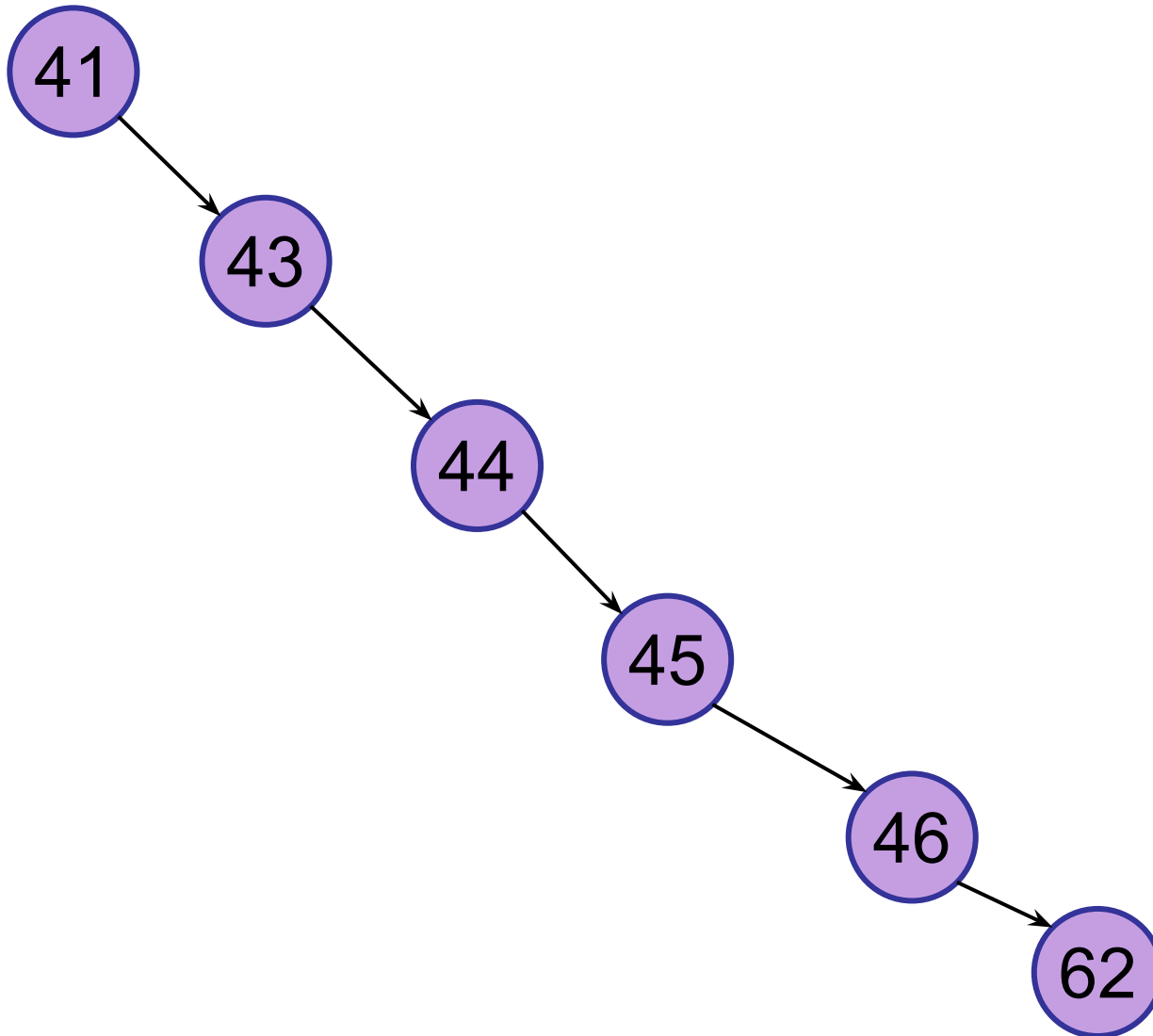
$\text{search}(72) : O(h)$   $h$  is the height of the tree



# Binary Search Trees

---

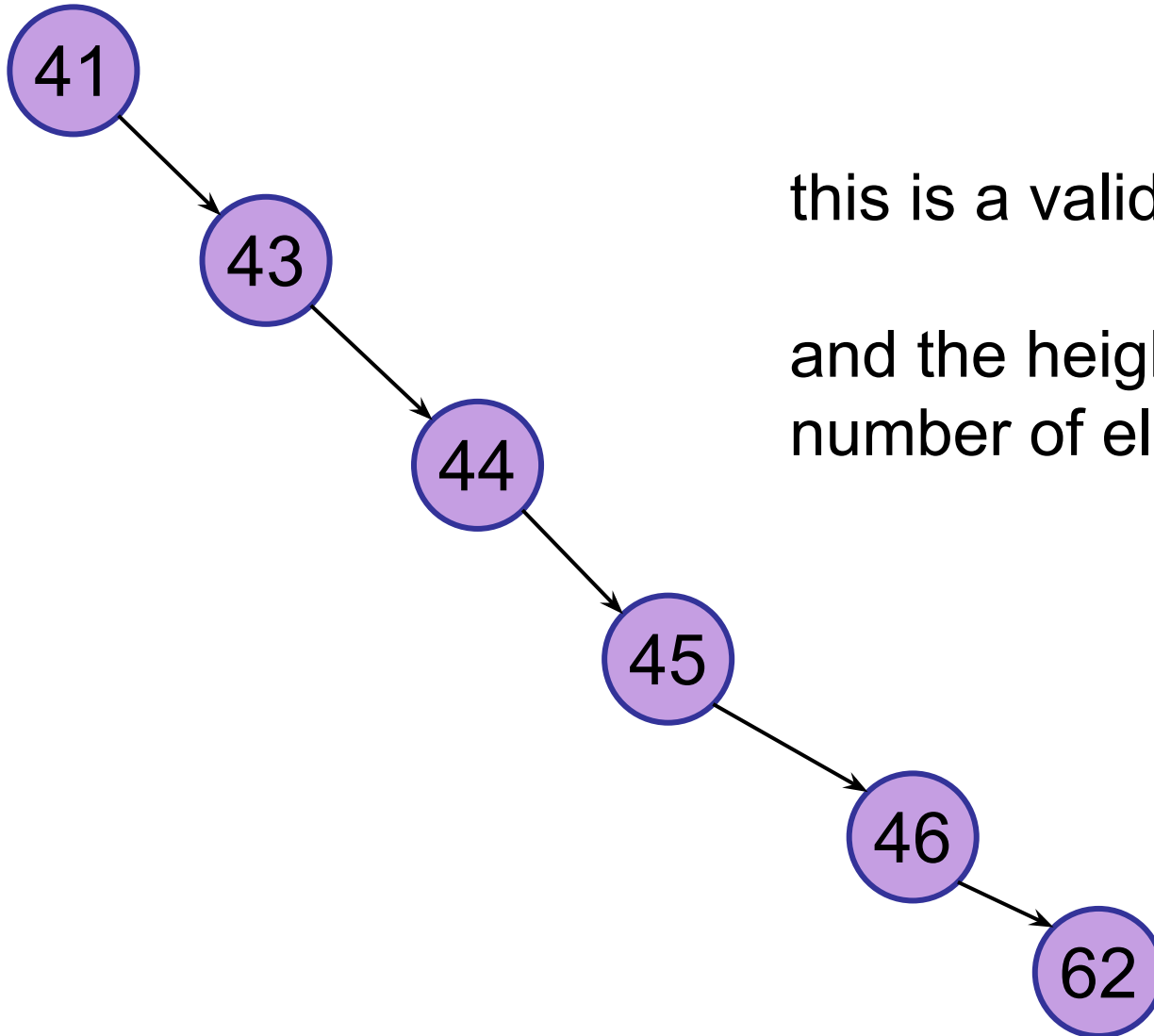
search(72) :  $O(\text{height})$



# Binary Search Trees

---

search(72) :  $O(\text{height})$




this is a valid BST

and the height + 1 =  
number of elements

# Binary Search Tree

---

What is the worst-case running time of **search** in a BST?

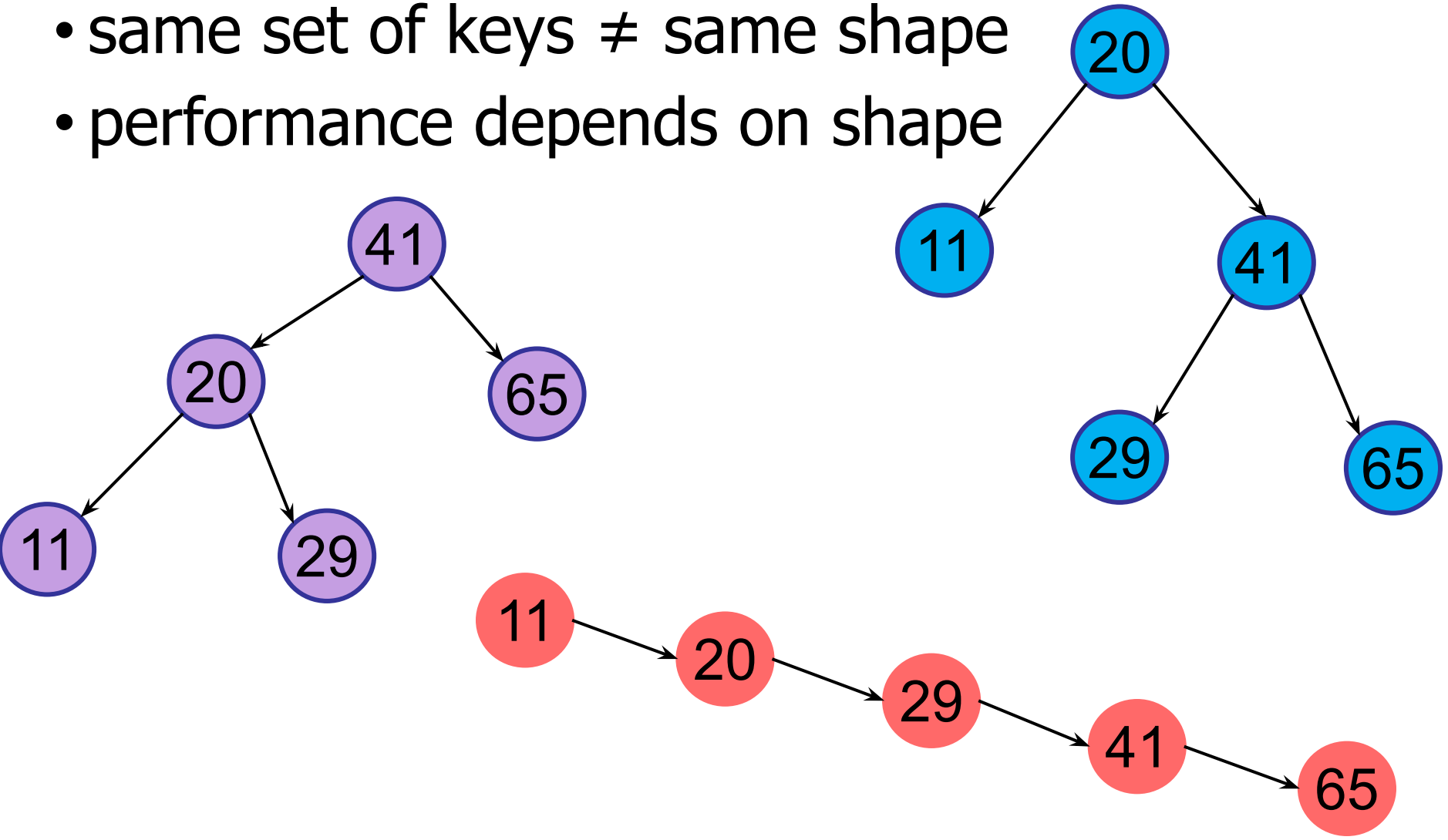
1.  $O(1)$
2.  $O(\log n)$
-  3.  $O(n)$
4.  $O(n^2)$
5.  $O(n^3)$
6.  $O(2^n)$

# Tree Shape

---

Trees come in many shapes

- same set of keys  $\neq$  same shape
- performance depends on shape



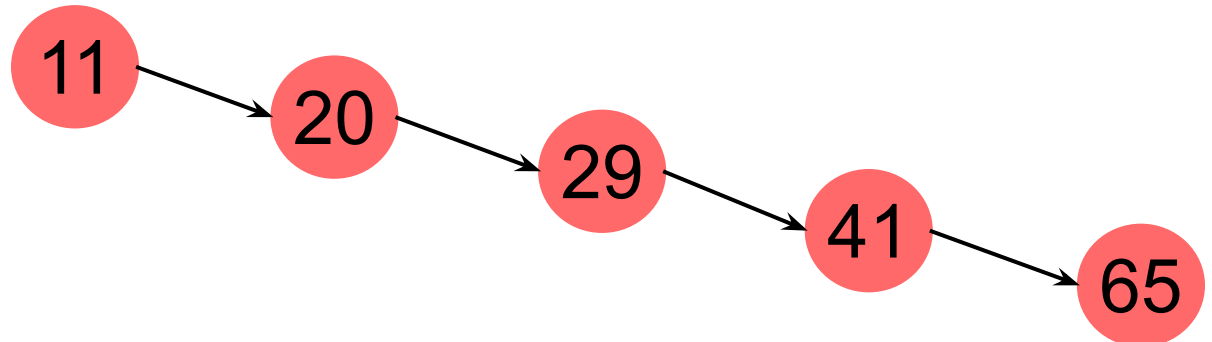
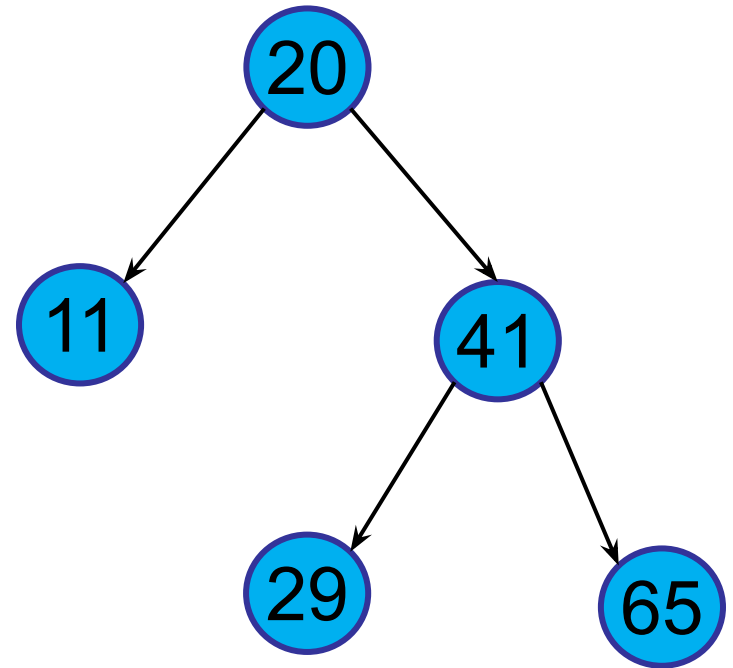
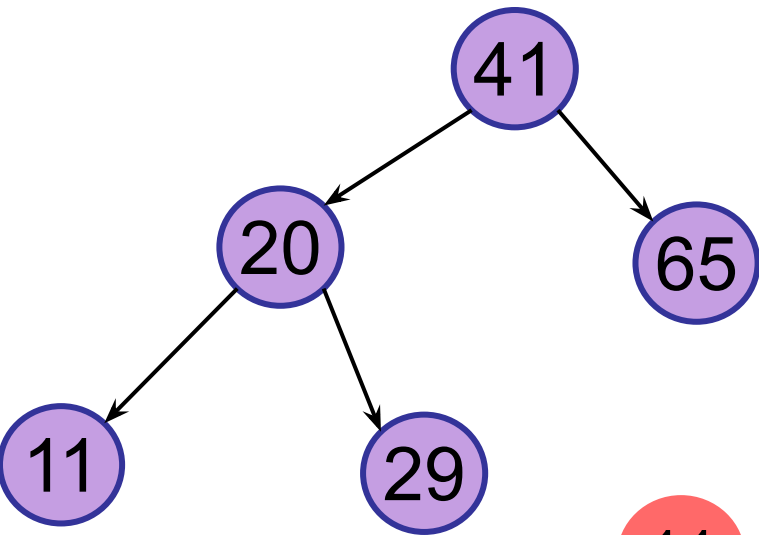


# Tree Shape

---

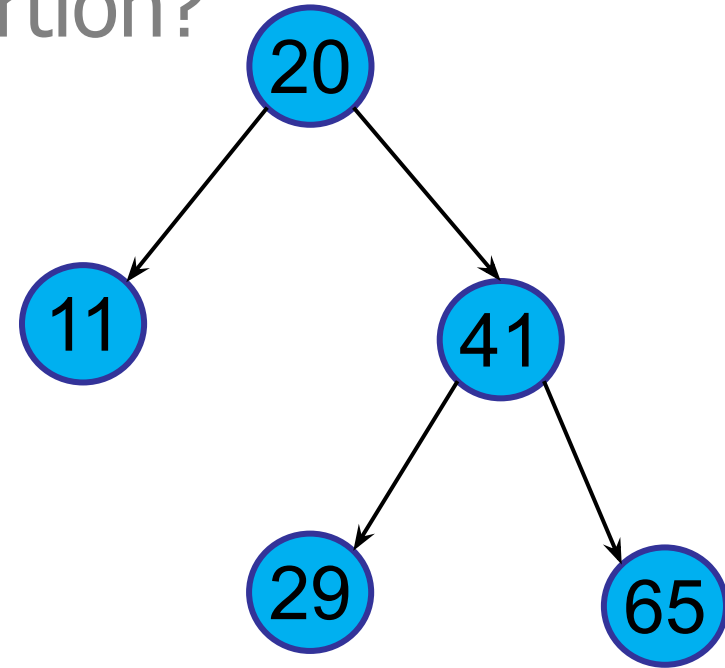
What determines shape?

- Order of insertion of items



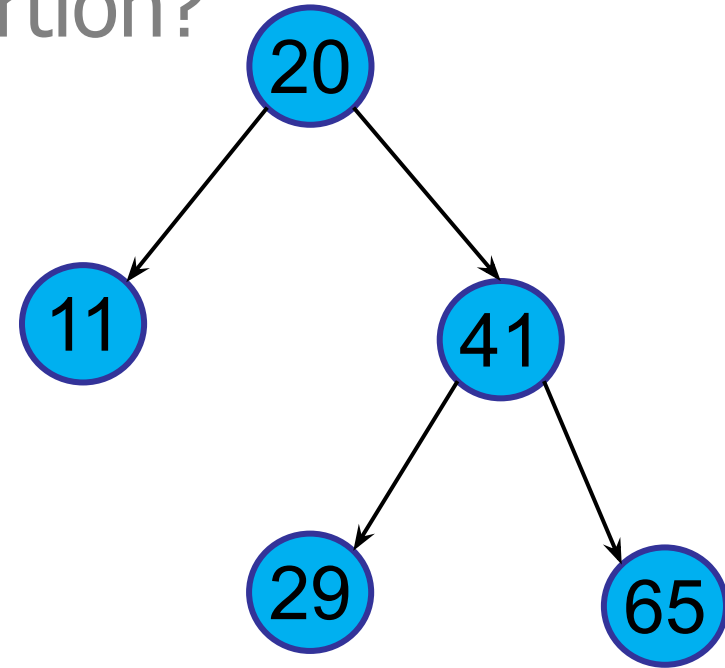
What was the order of insertion?

1. 11, 20, 29, 41, 65
2. 20, 11, 41, 29, 65
3. 11, 20, 41, 29, 65
4. 65, 41, 29, 20, 11
5. Impossible to tell.



What was the order of insertion?

1. 11, 20, 29, 41, 65
- ✓ 2. 20, 11, 41, 29, 65
3. 11, 20, 41, 29, 65
4. 65, 41, 29, 20, 11
5. Impossible to tell.

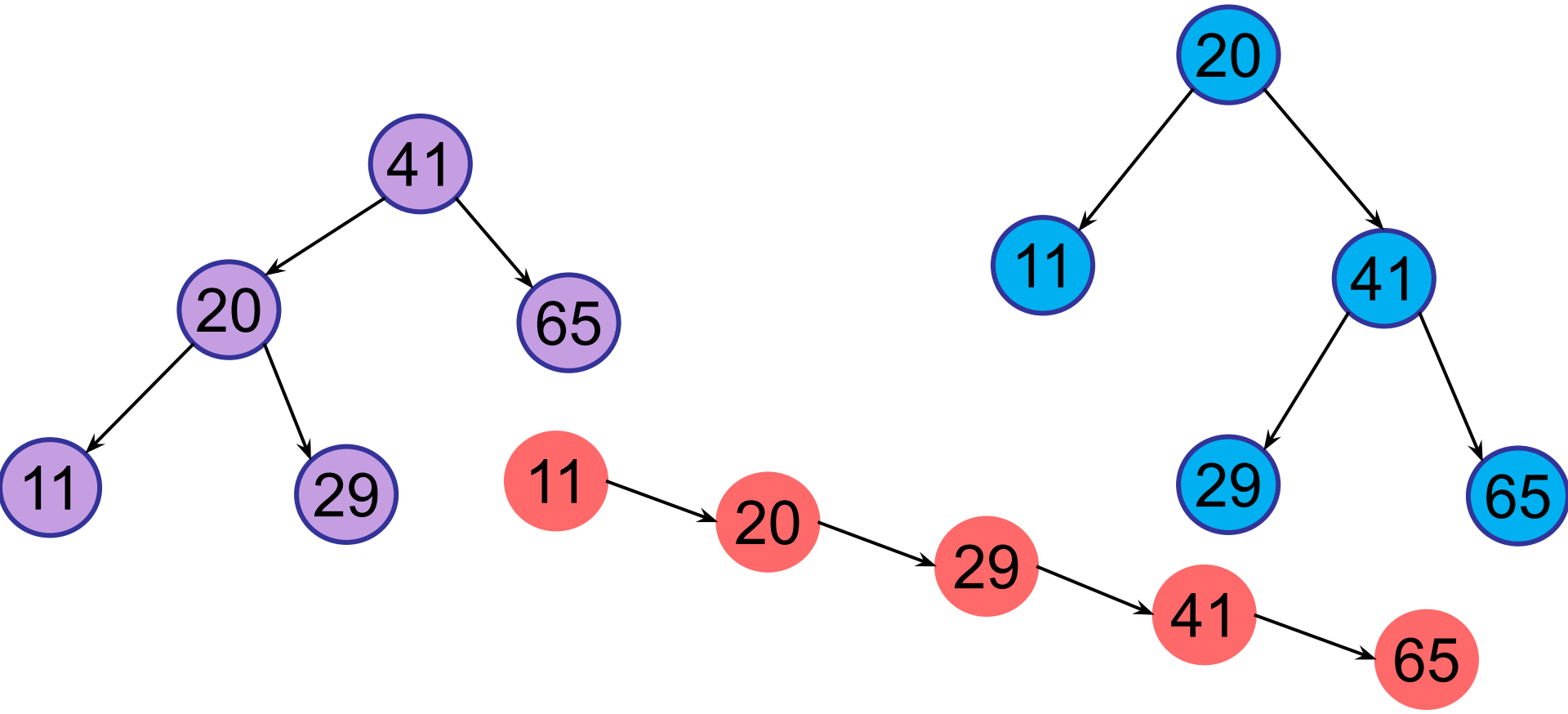


# Tree Shape

---

What determines shape?

- Order of insertion
- Does each order yield a unique shape?



# Tree Shape

---

What determines shape?

- Order of insertion
- Does each order yield a unique shape? NO
  - # ways to order insertions:  $n!$
  - # shapes of a binary tree?  $\sim 4^n$

Catalan Numbers



# Tree Shape

---

## What determines shape?

- Order of insertion
- Does each order yield a unique shape? NO
  - # ways to order insertions:  $n!$
  - # shapes of a binary tree?  $\sim 4^n$

By Pigeonhole principle, this means that there exists at least 2 orderings that share the same shape.

# Tree Shape

---

## Catalan Numbers

$C_n = \#$  of trees with  $(n+1)$  nodes

$C_n = \#$  expressions with  $n$  pairs of matched parentheses

$((()))$      $()(())$      $((()())$      $((()))()$      $()()()$

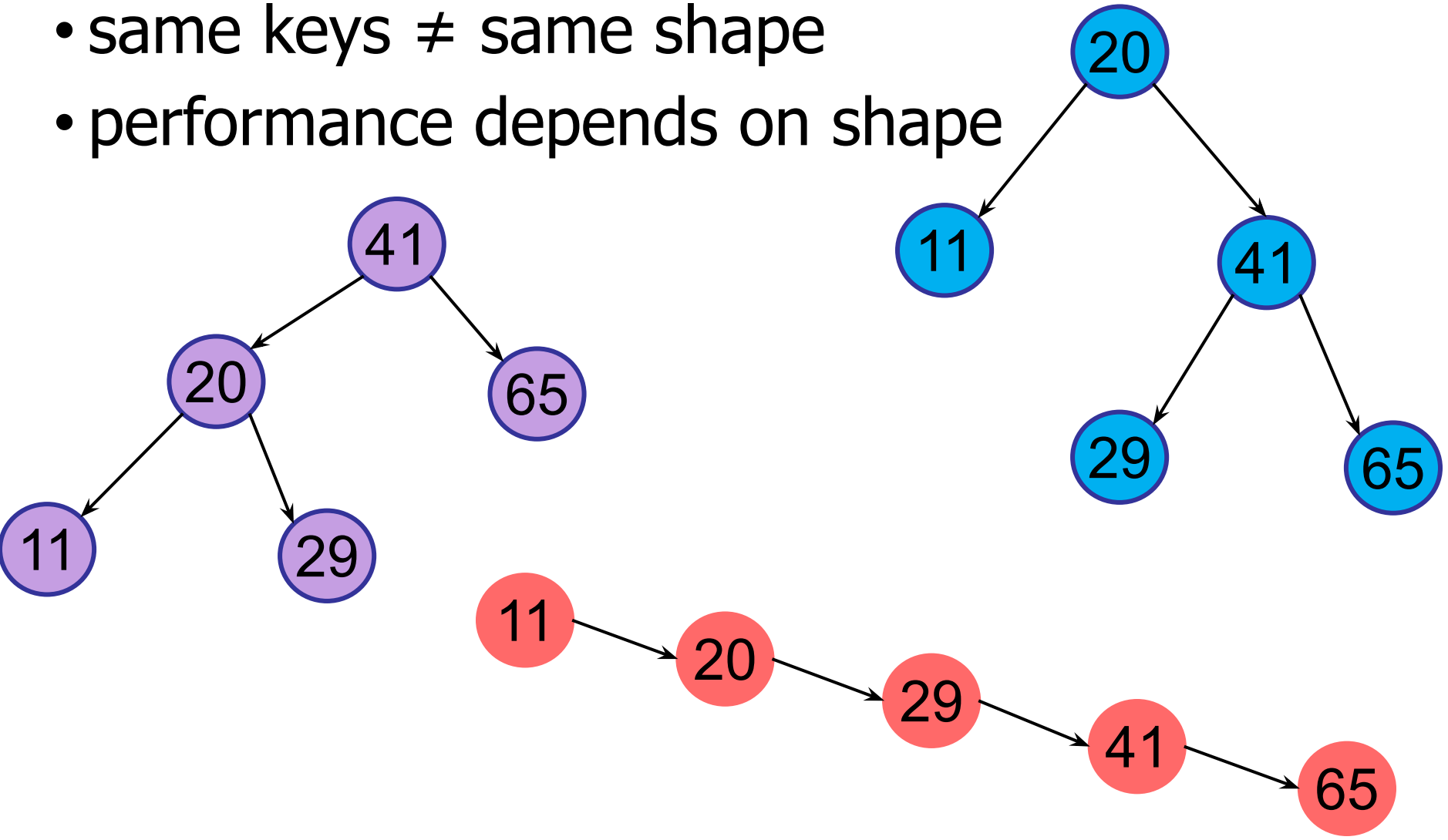
Puzzle: why are these the same?

# Tree Shape

---

Trees come in many shapes

- same keys  $\neq$  same shape
- performance depends on shape



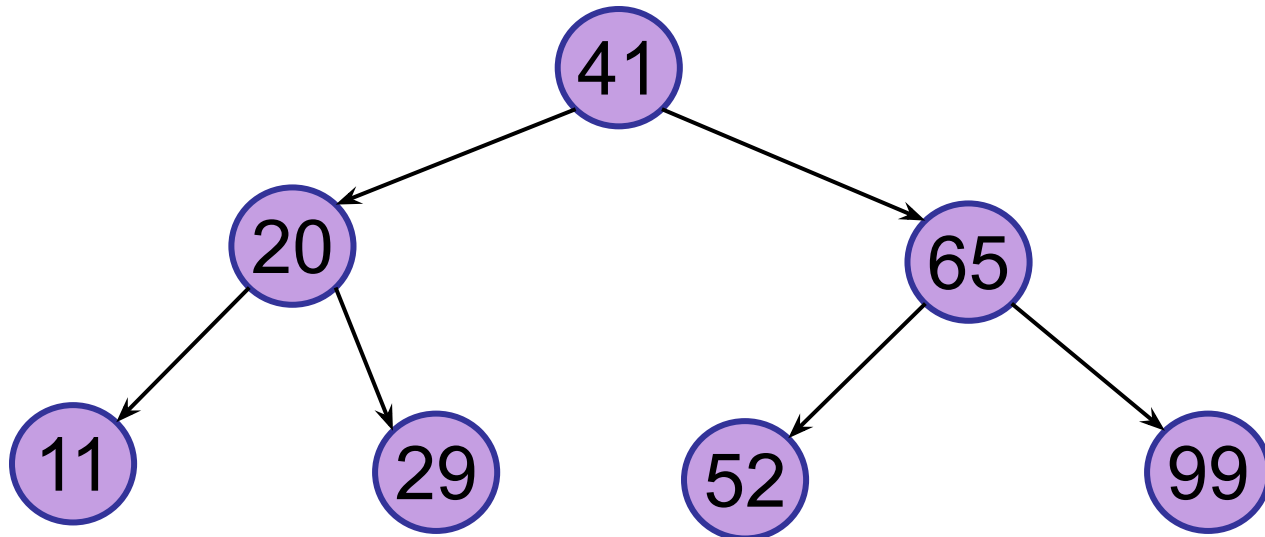


# Tree Shape

---

Trees come in many shapes

- same keys  $\neq$  same shape
- performance depends on shape
- insert keys in a *random* order  $\Rightarrow$  balanced



# Binary Search Trees

---

## 1. Terminology and Definitions

## 2. Basic operations:

- height
- searchMin, searchMax
- search, insert

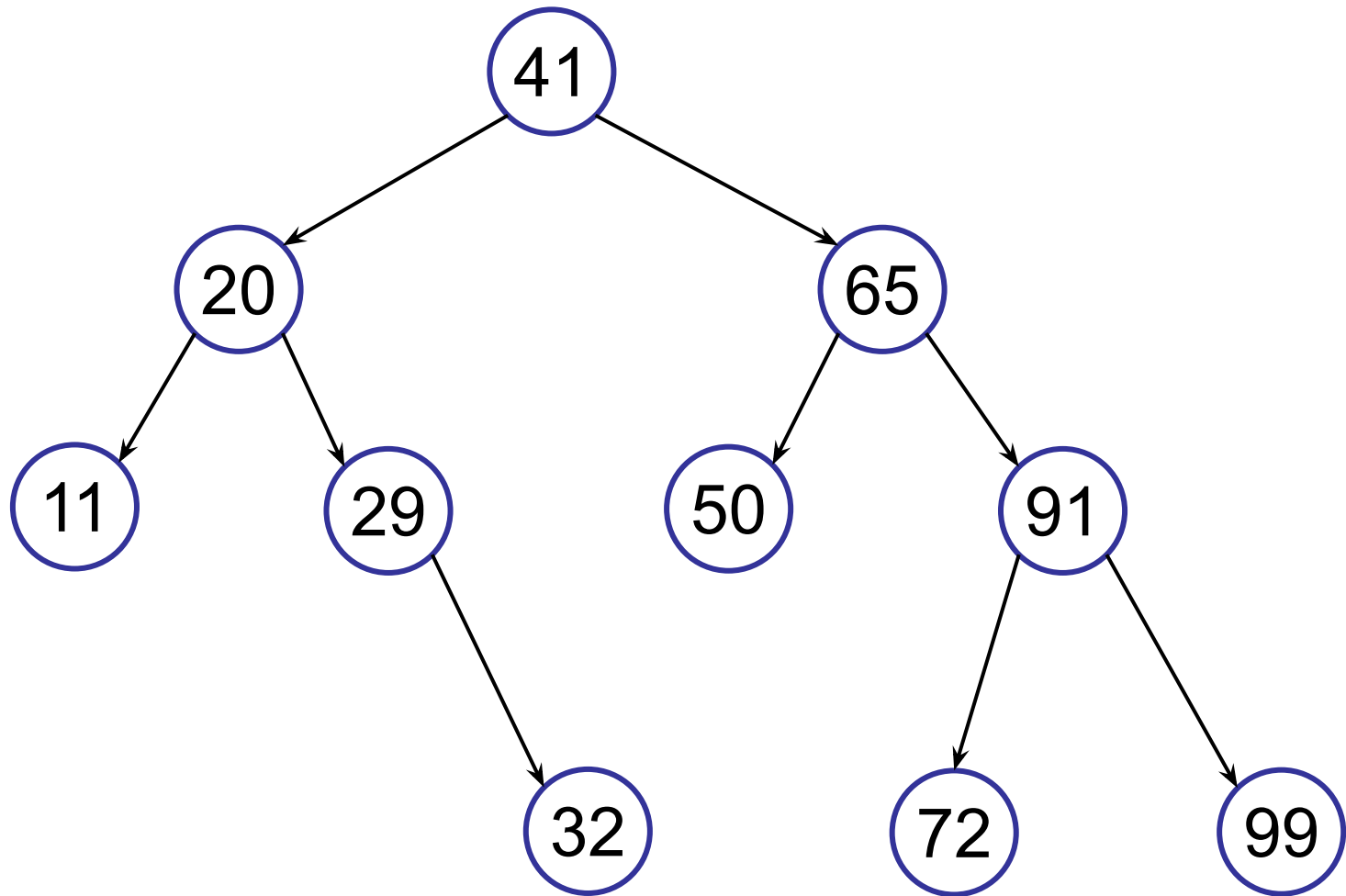
## 3. Traversals

- in-order, pre-order, post-order 

## 4. Other operations

# Tree Traversal

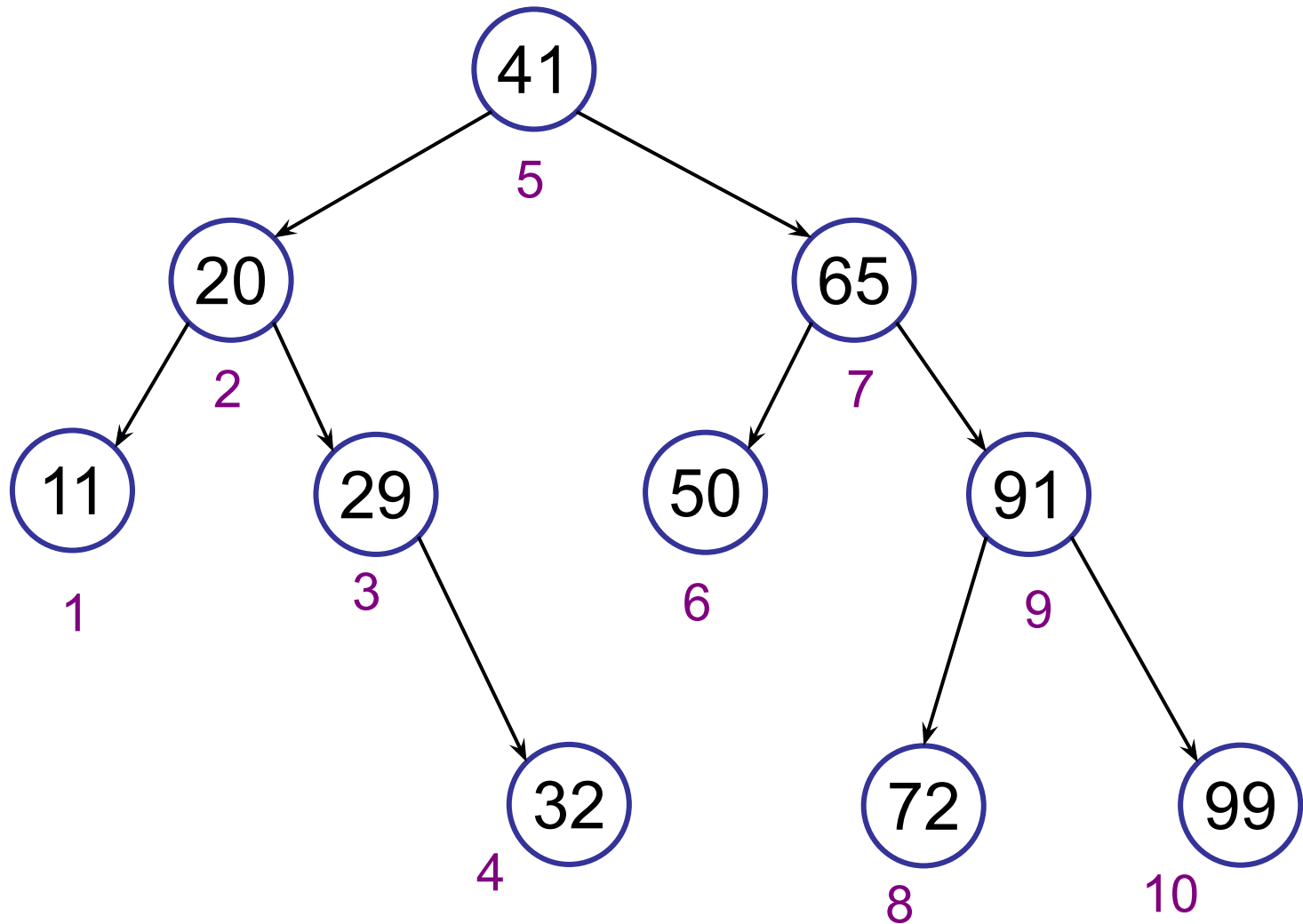
---



11 20 29 32 41 50 65 72 91 99

# Tree Traversal

---

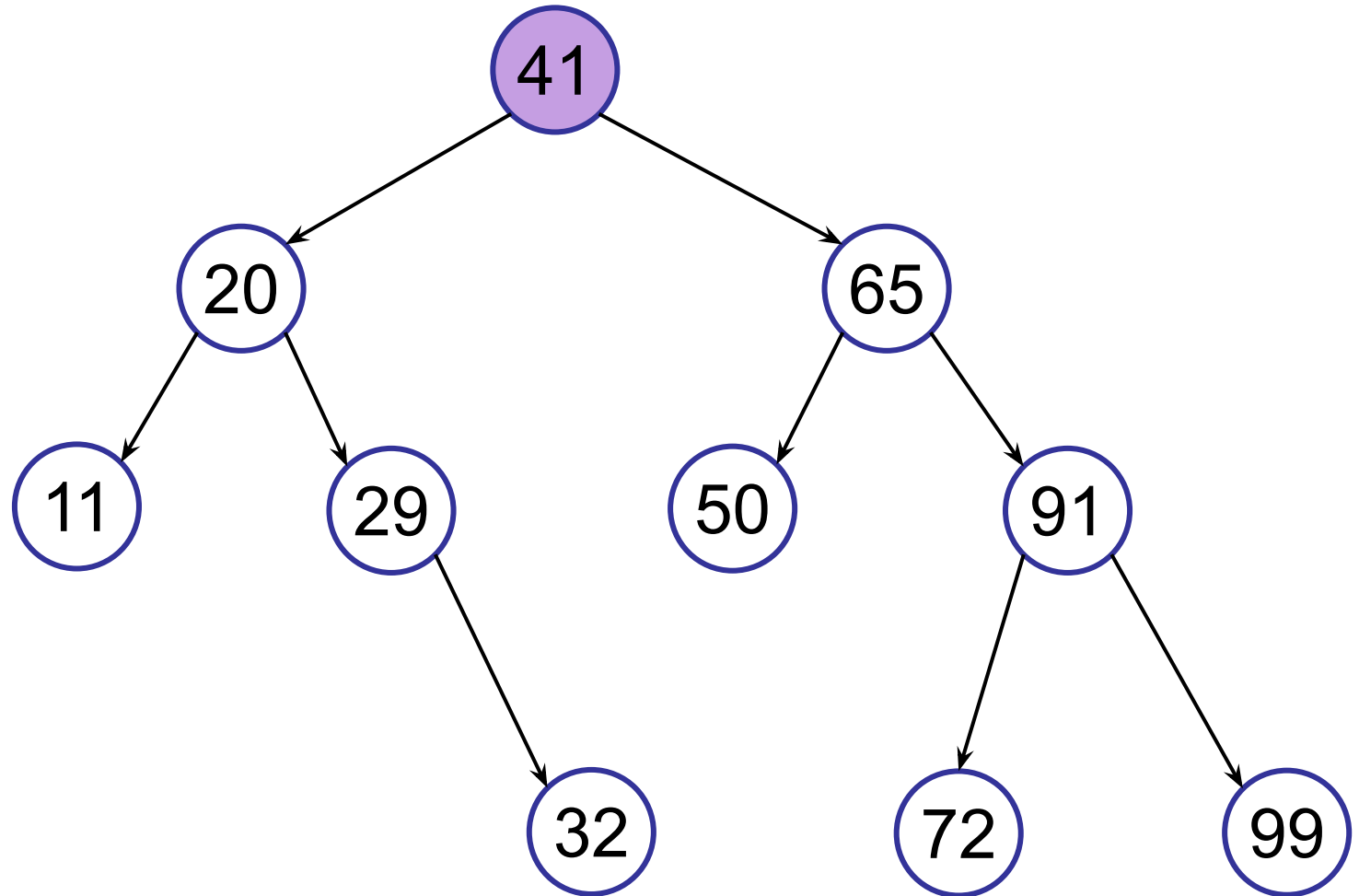


11 20 29 32 41 50 65 72 91 99

# Tree Traversal

---

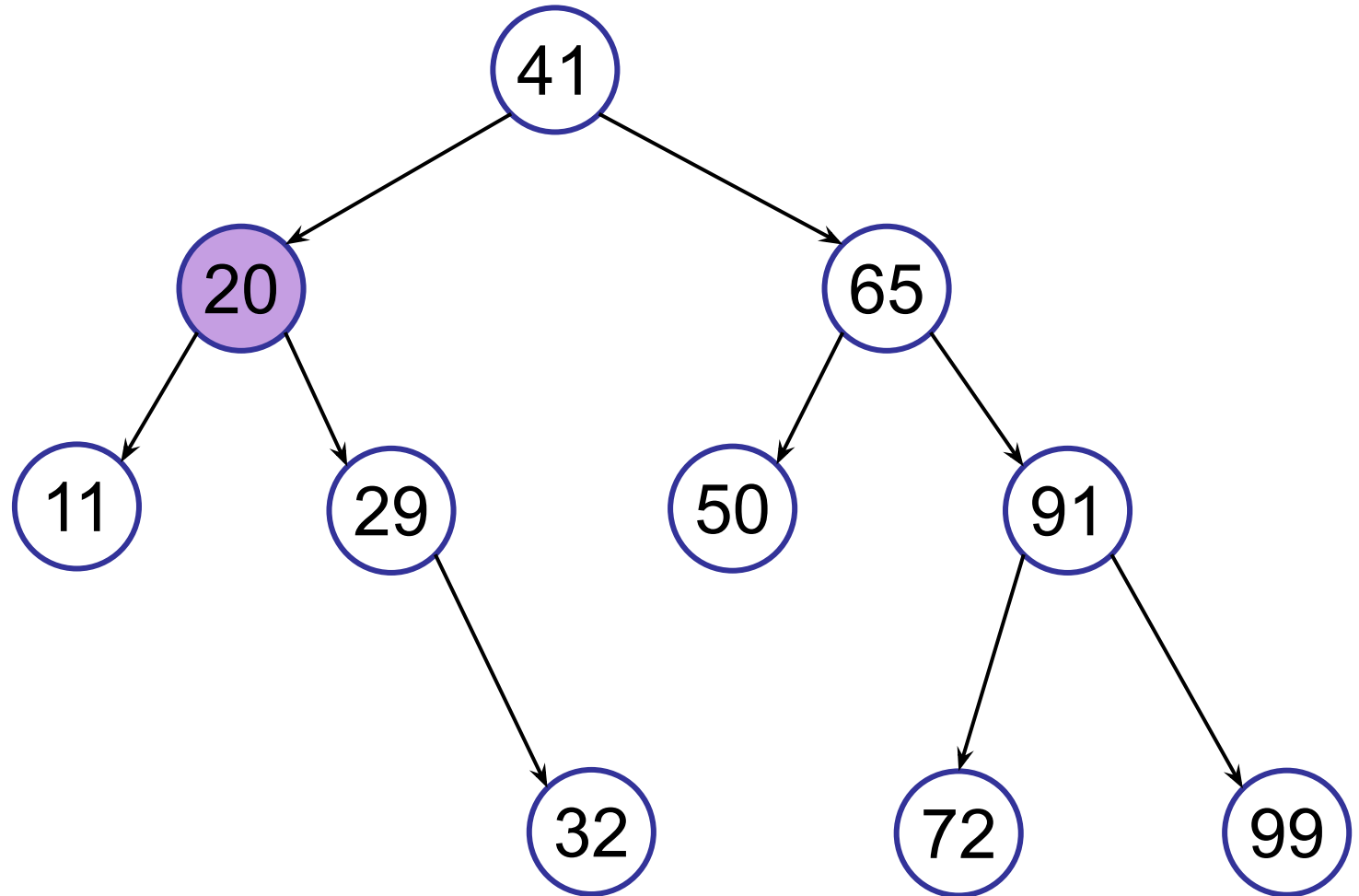
in-order-traversal



# Tree Traversal

---

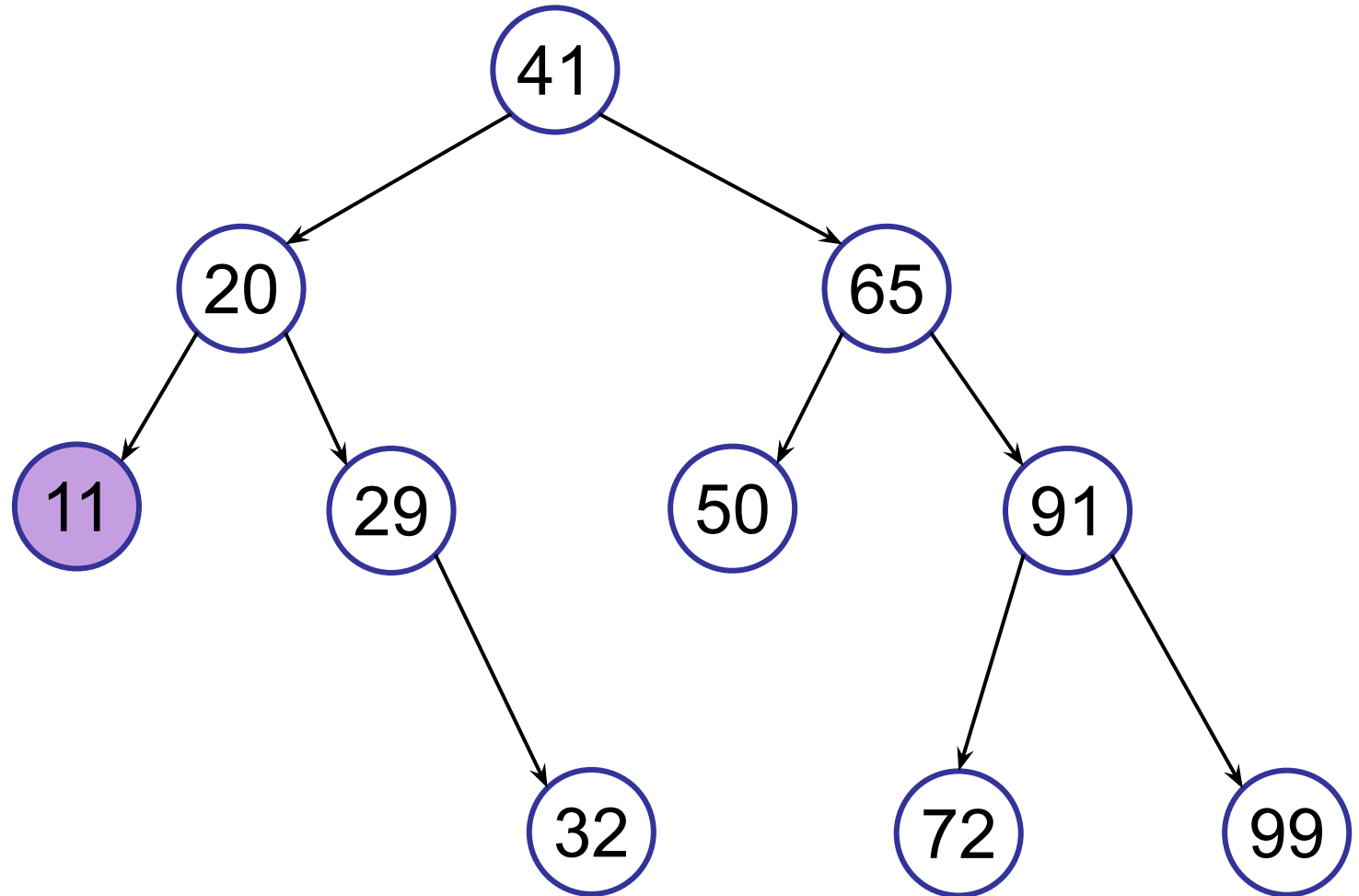
in-order-traversal



# Tree Traversal

---

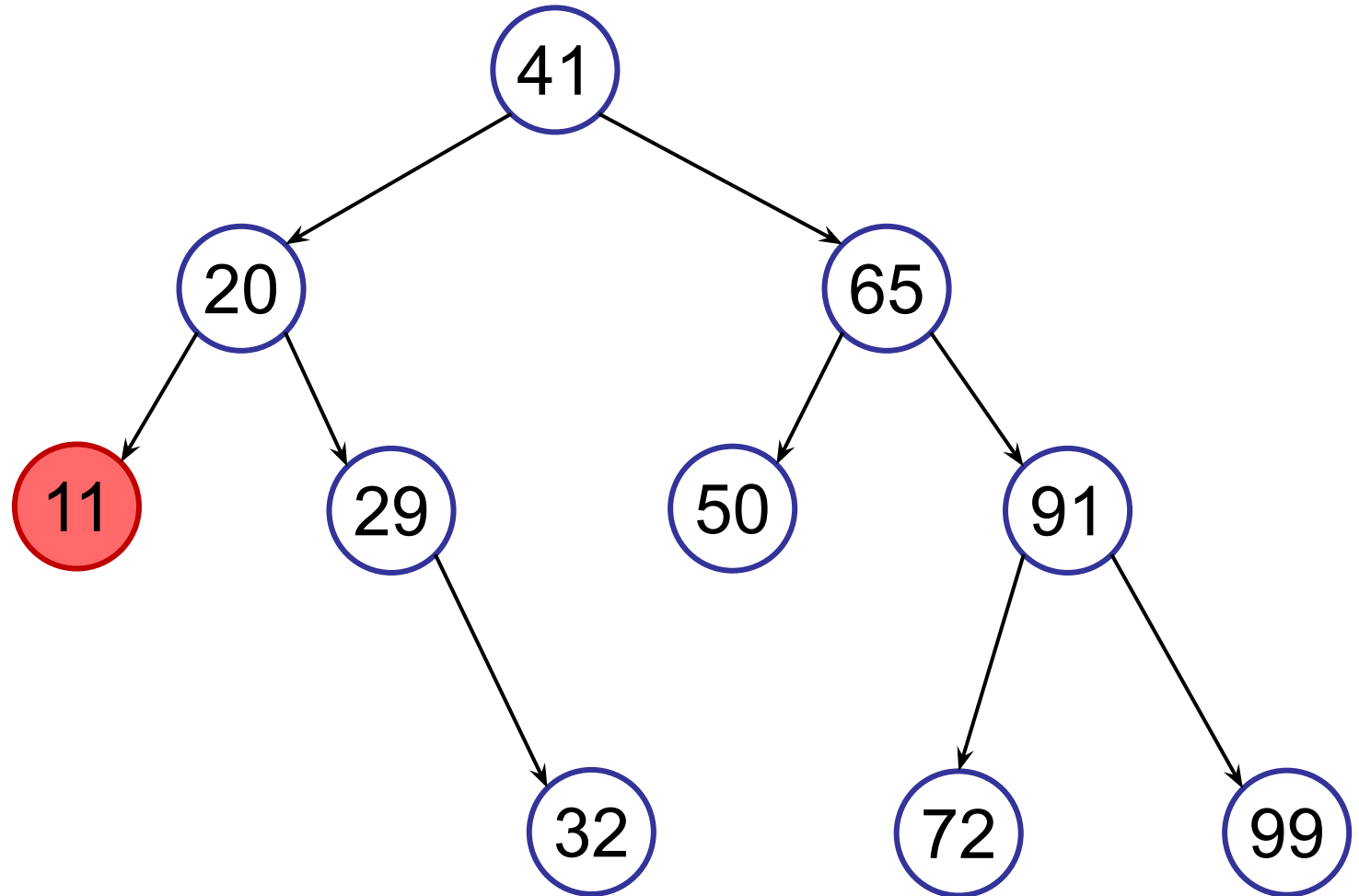
in-order-traversal



# Tree Traversal

---

in-order-traversal

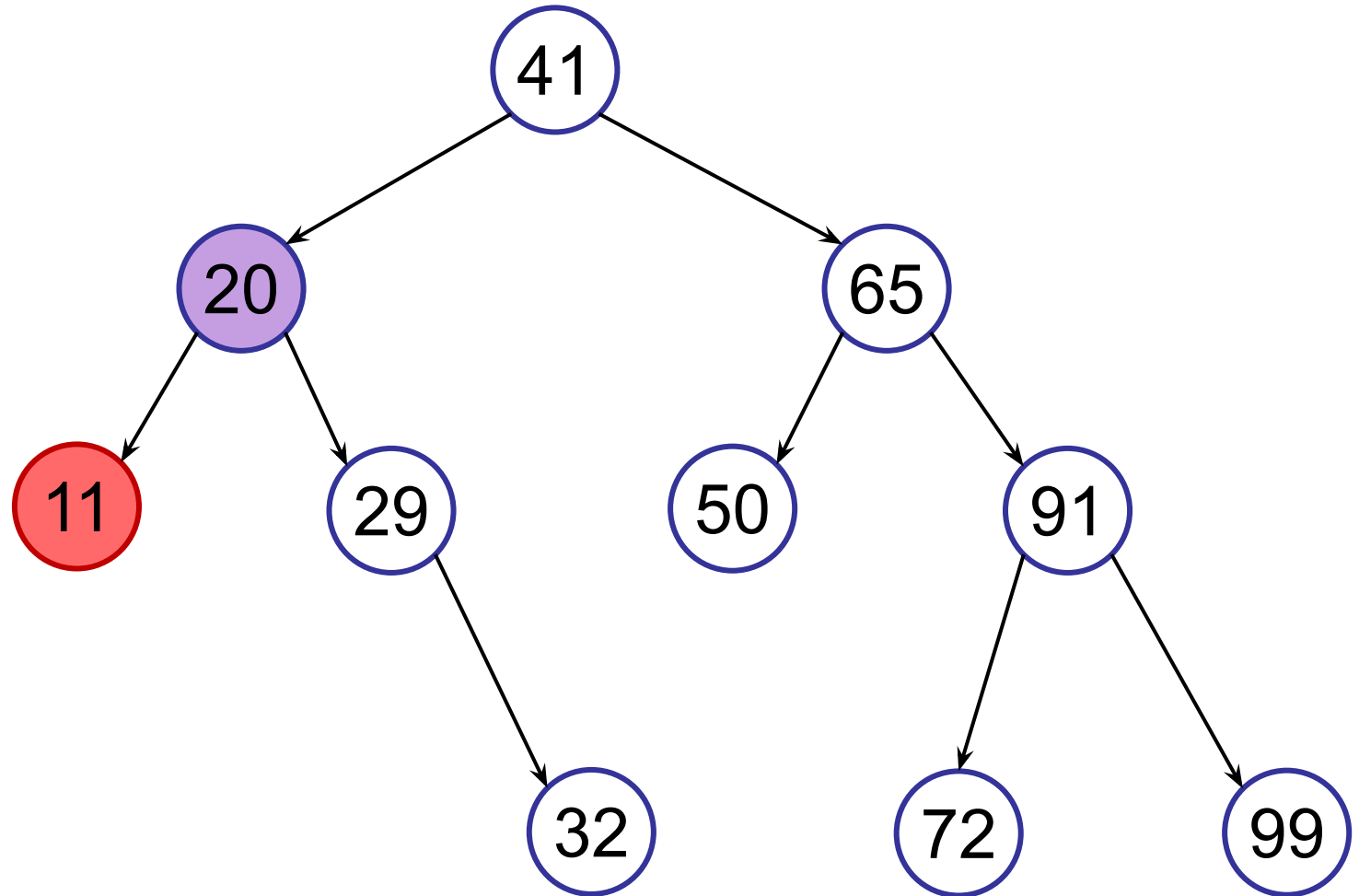




# Tree Traversal

---

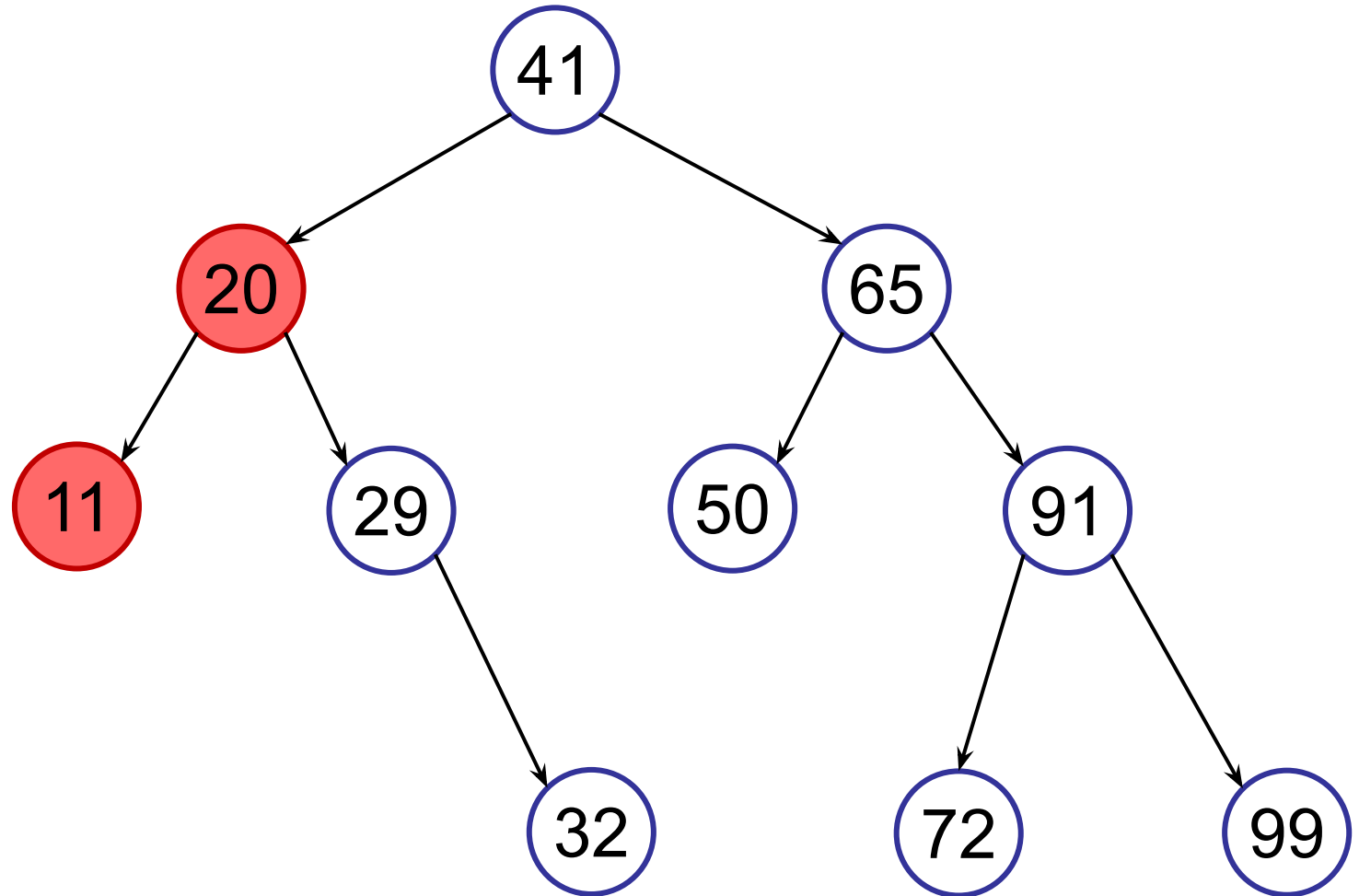
in-order-traversal



# Tree Traversal

---

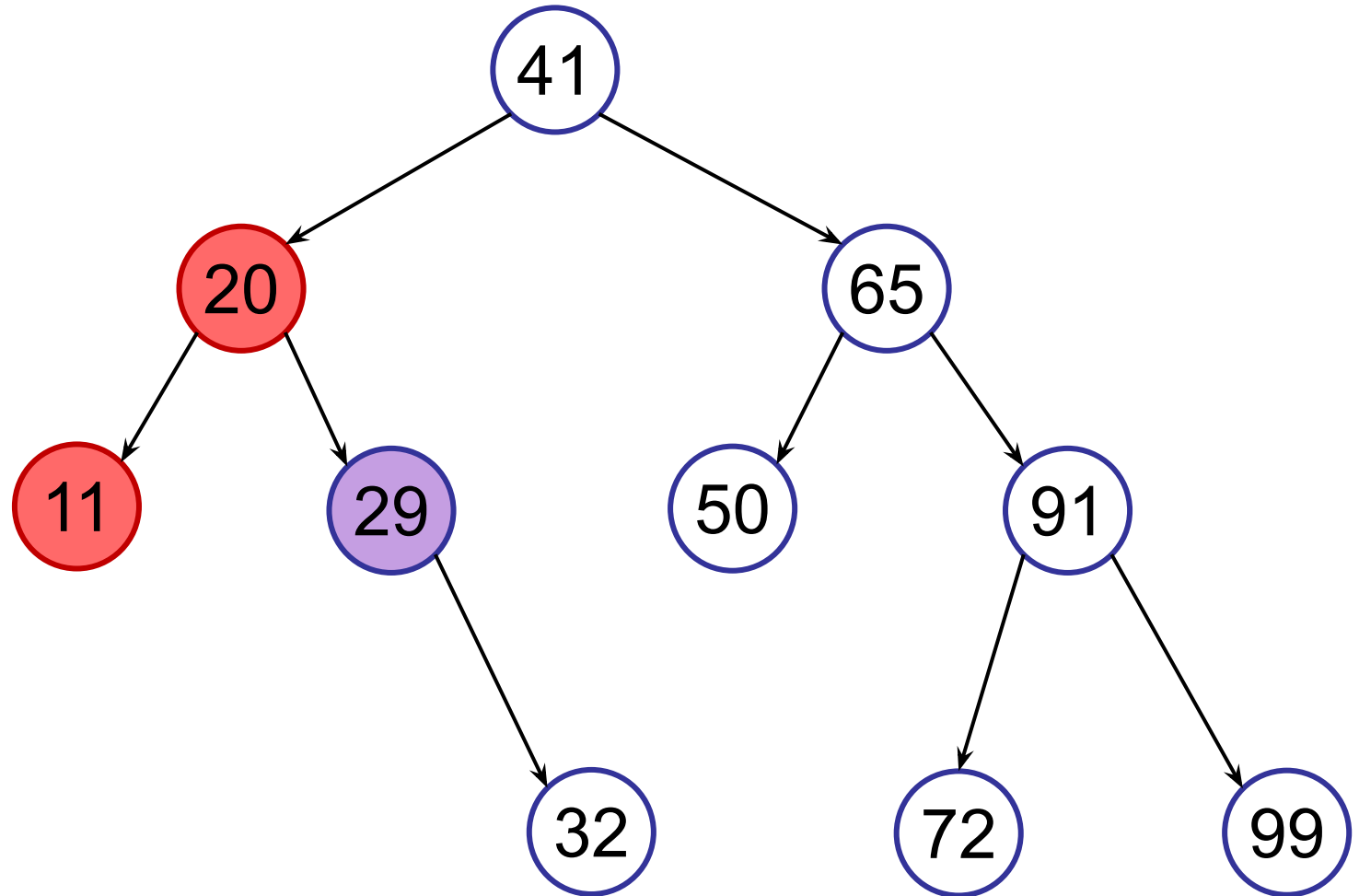
in-order-traversal



# Tree Traversal

---

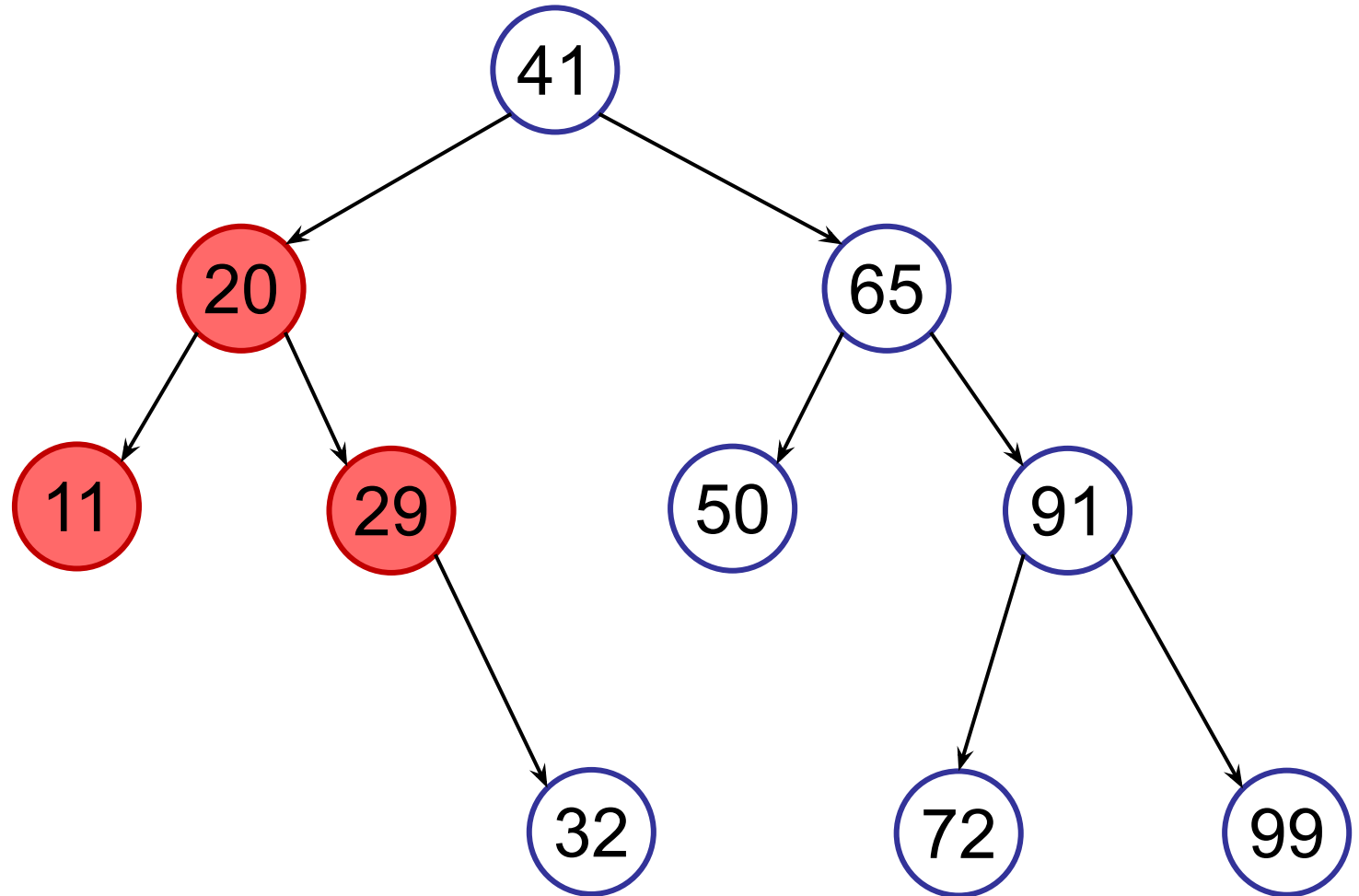
in-order-traversal



# Tree Traversal

---

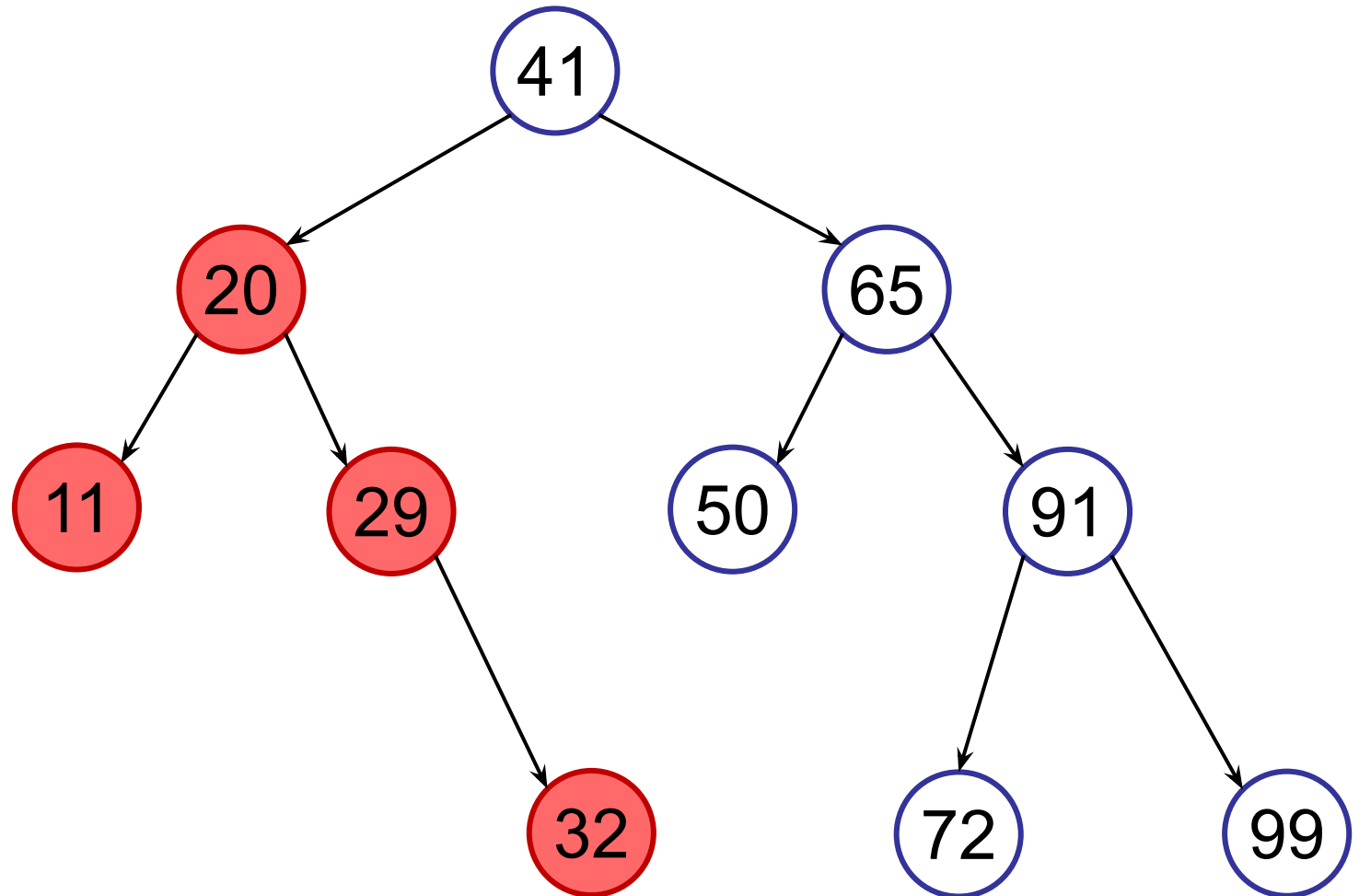
in-order-traversal



# Tree Traversal

---

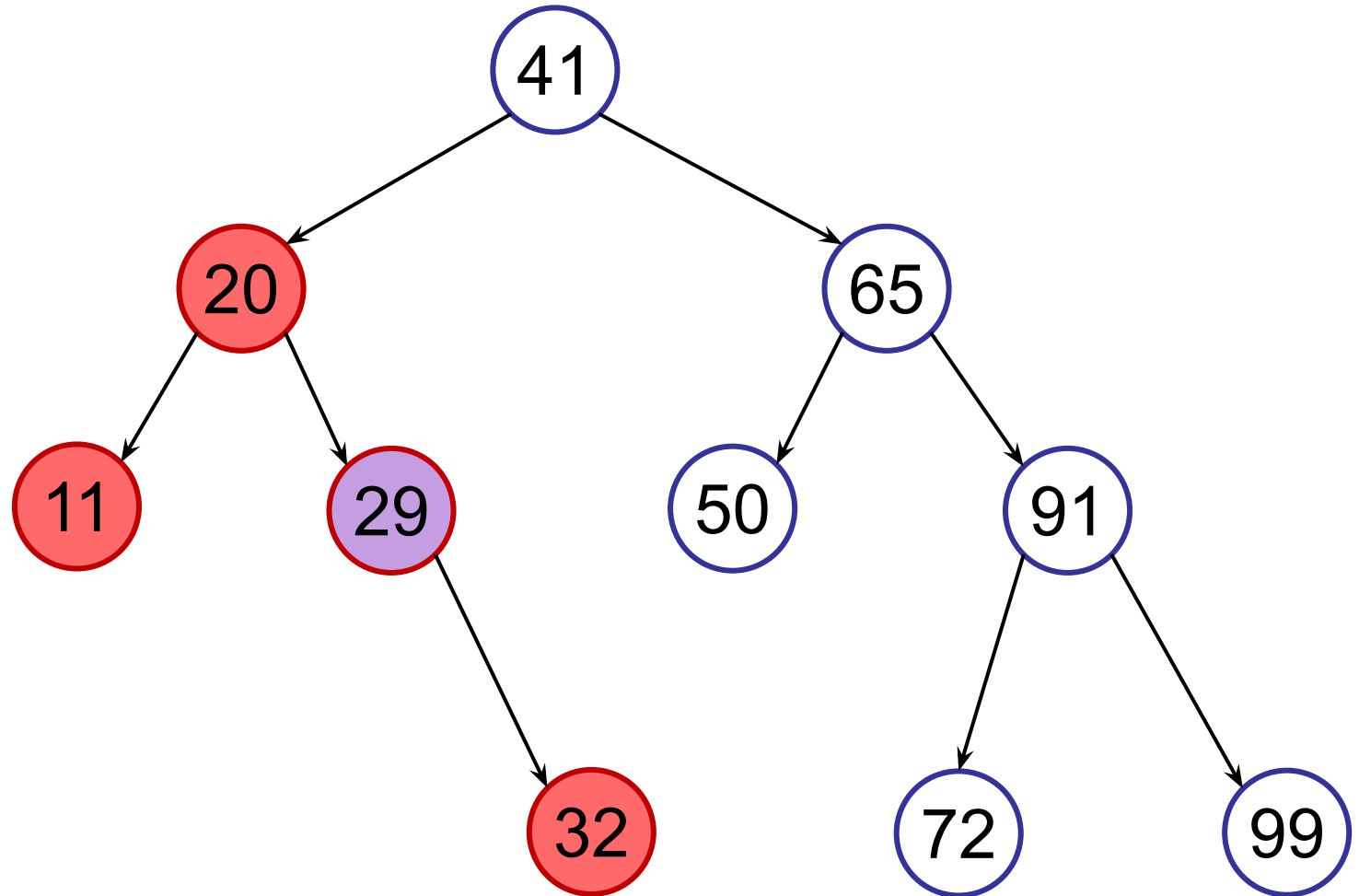
in-order-traversal



# Tree Traversal

---

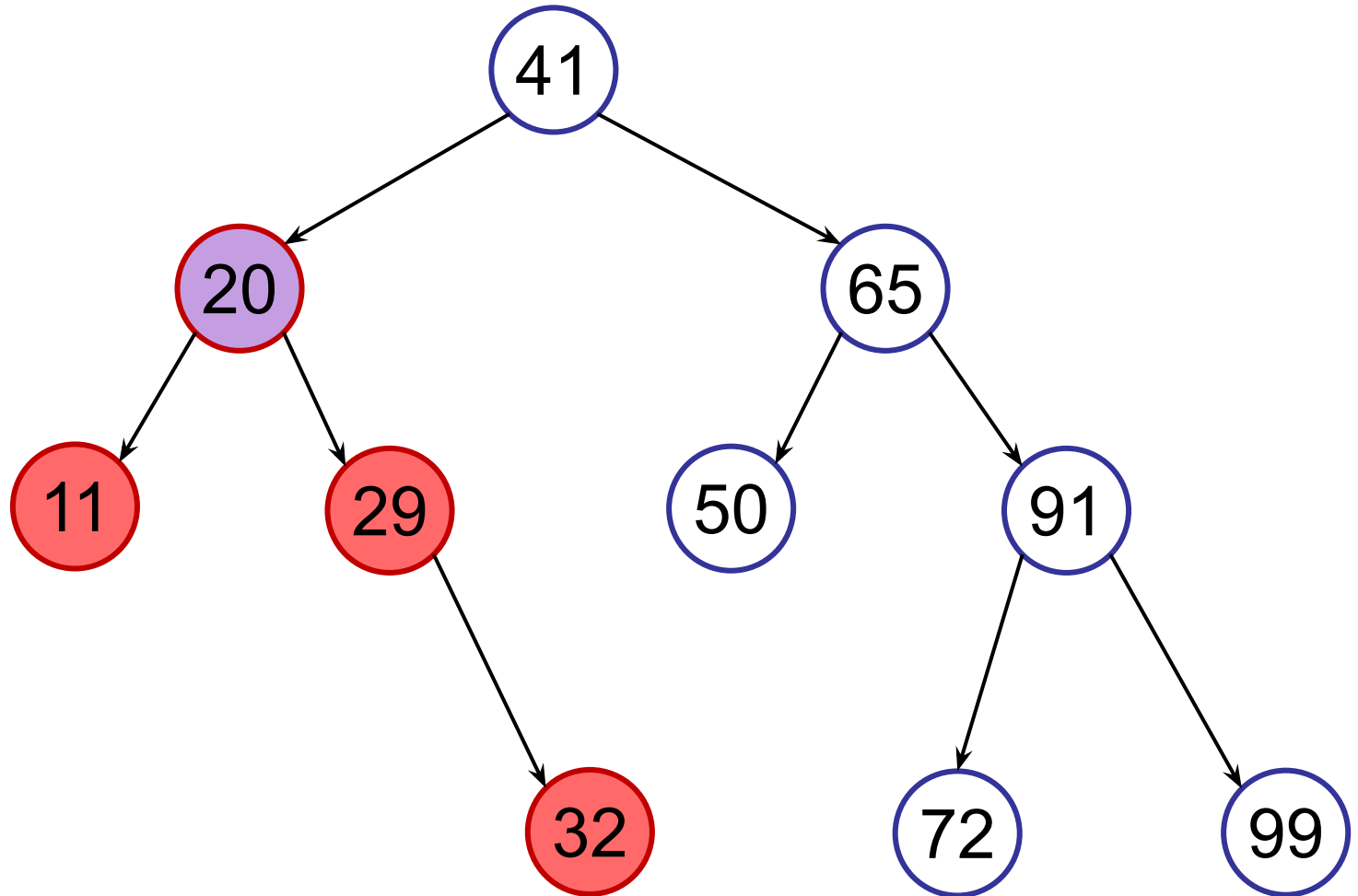
in-order-traversal



# Tree Traversal

---

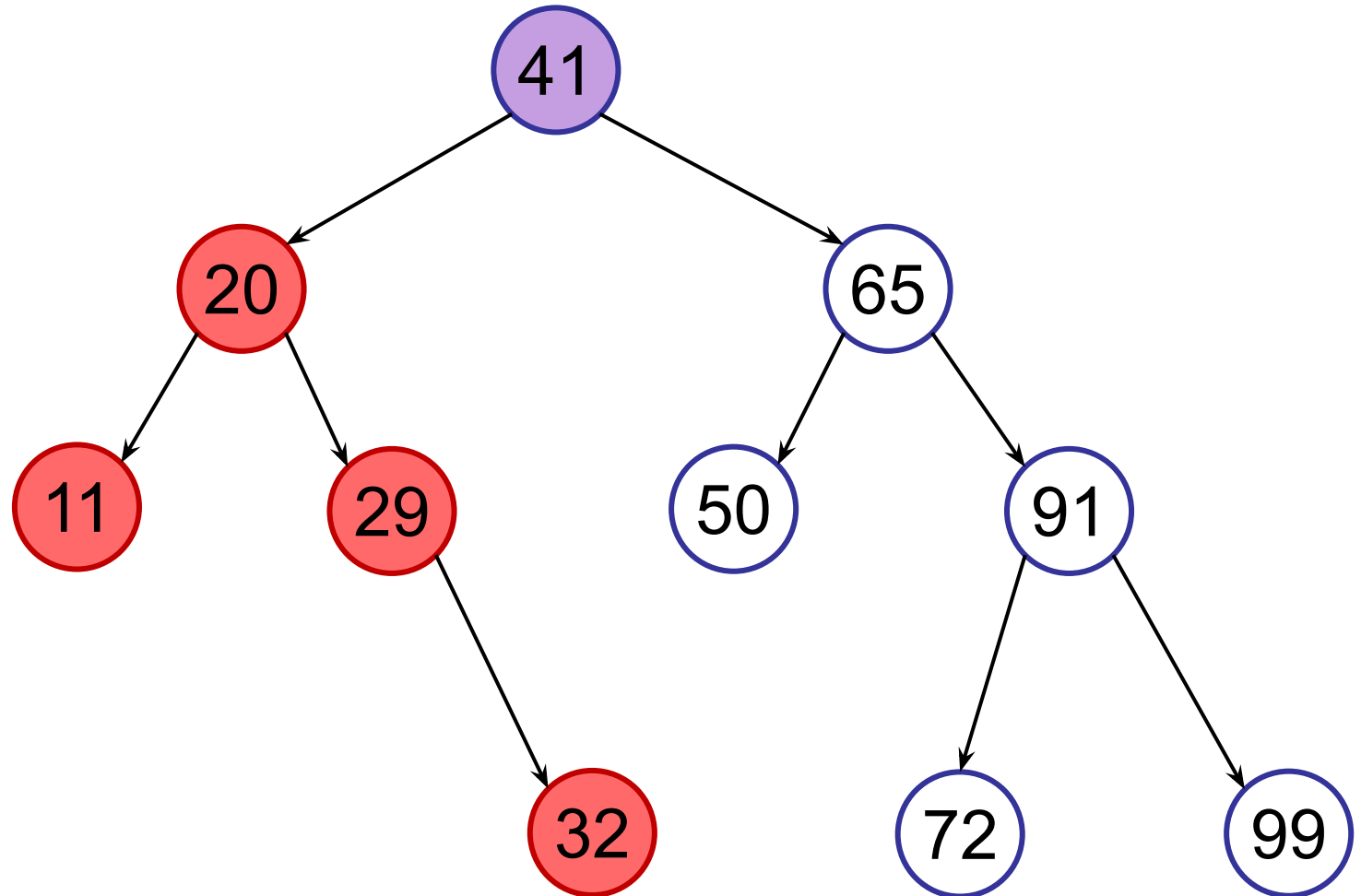
in-order-traversal



# Tree Traversal

---

in-order-traversal

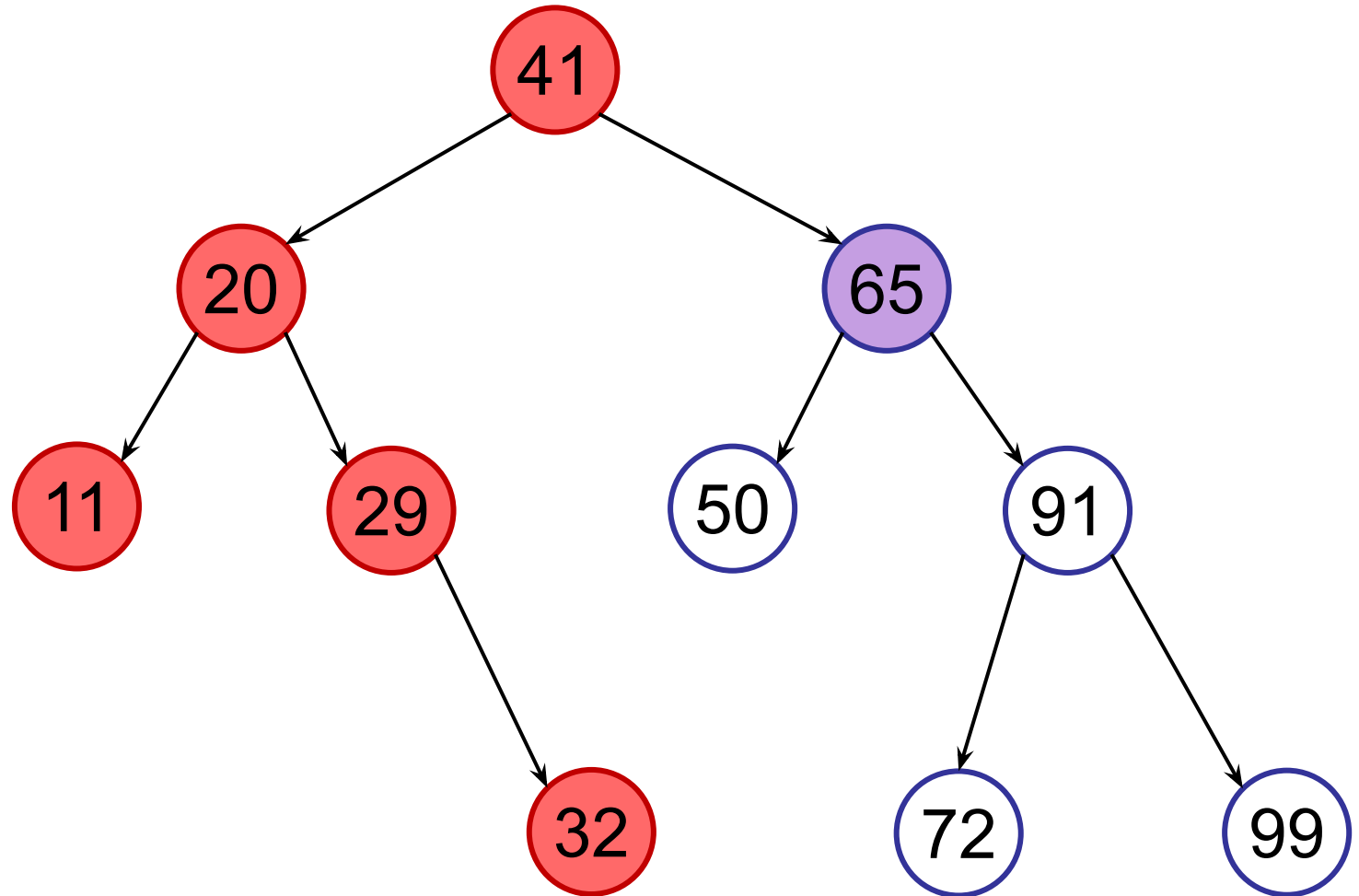




# Tree Traversal

---

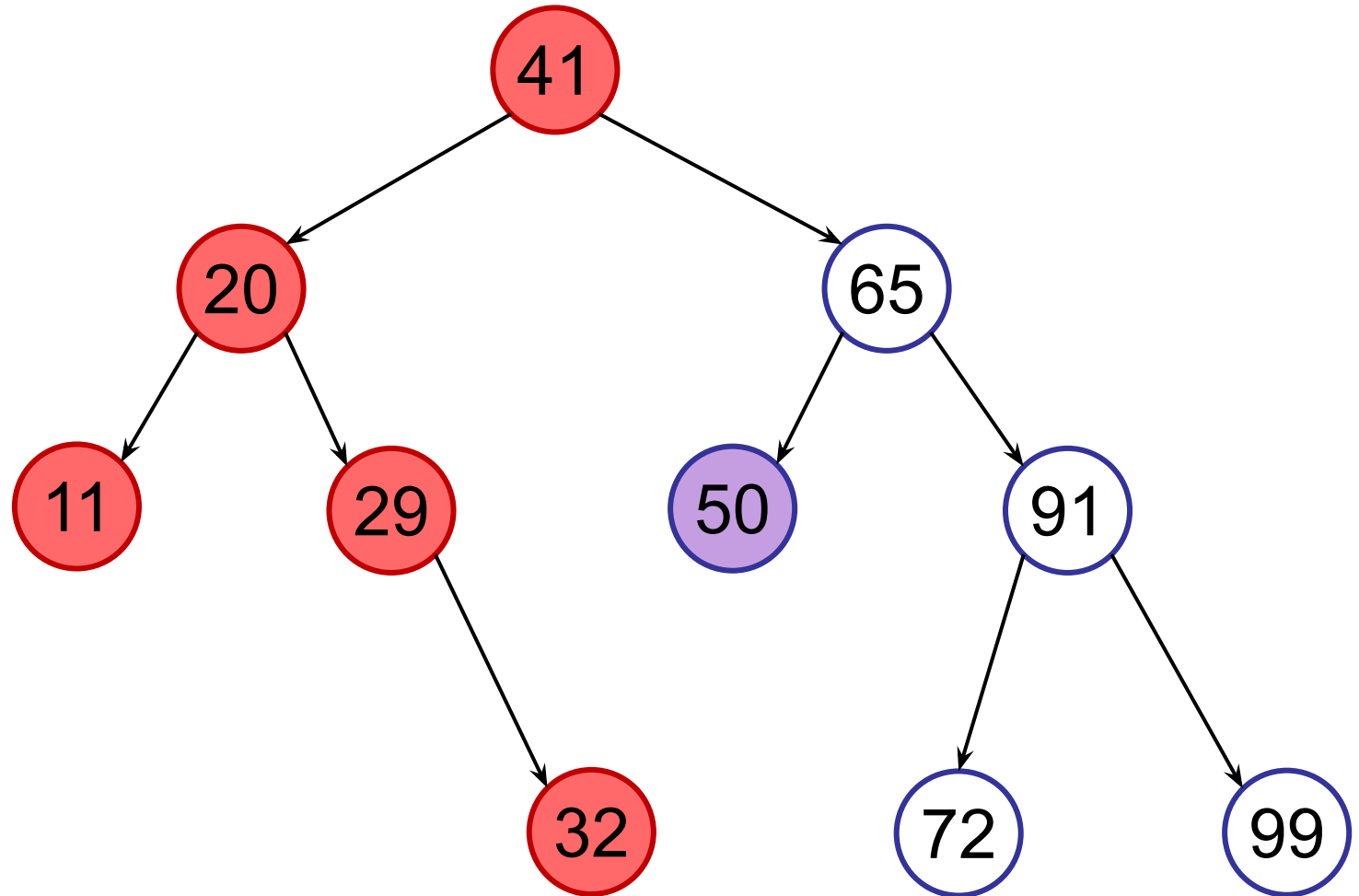
in-order-traversal



# Tree Traversal

---

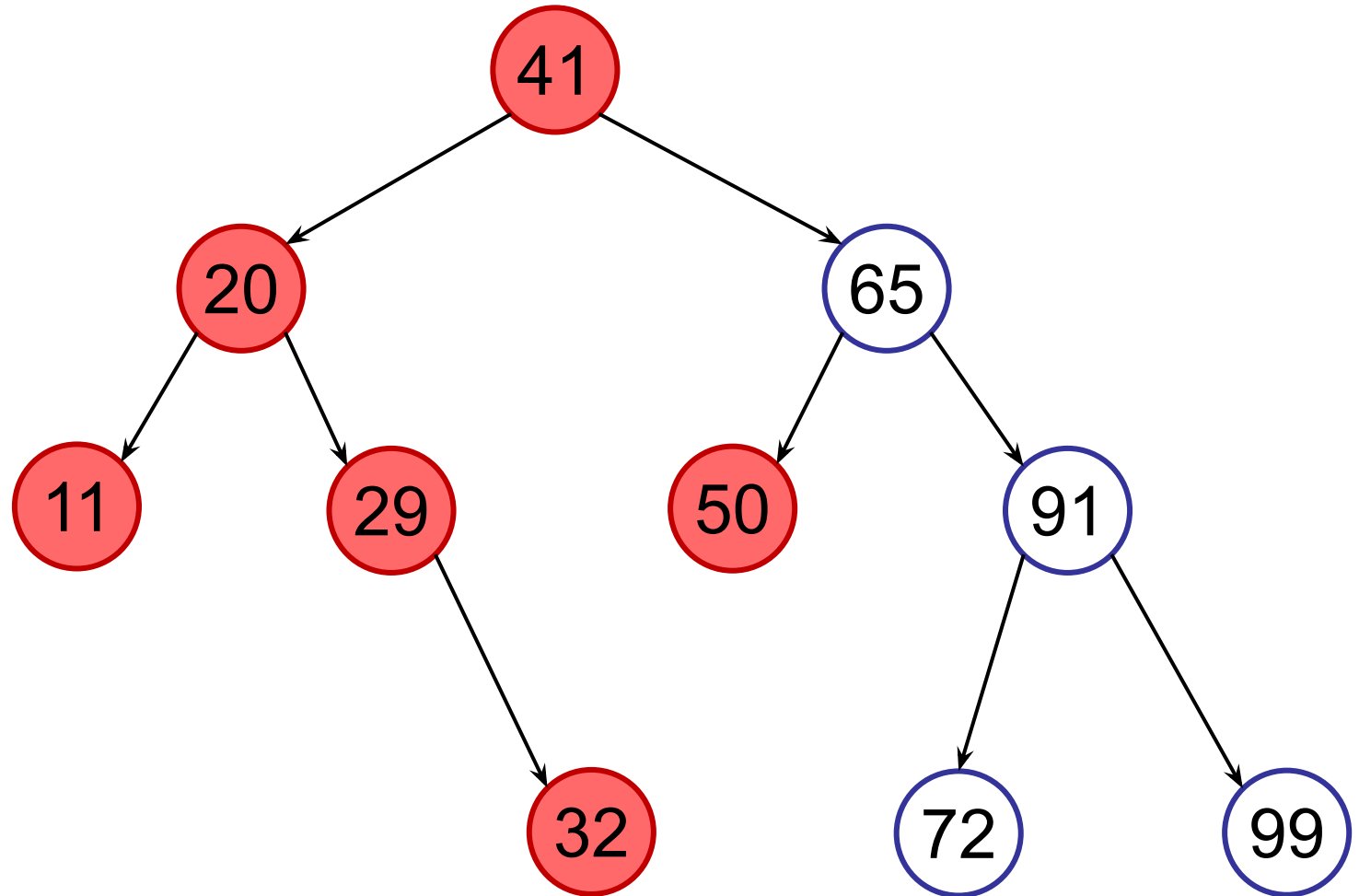
in-order-traversal



# Tree Traversal

---

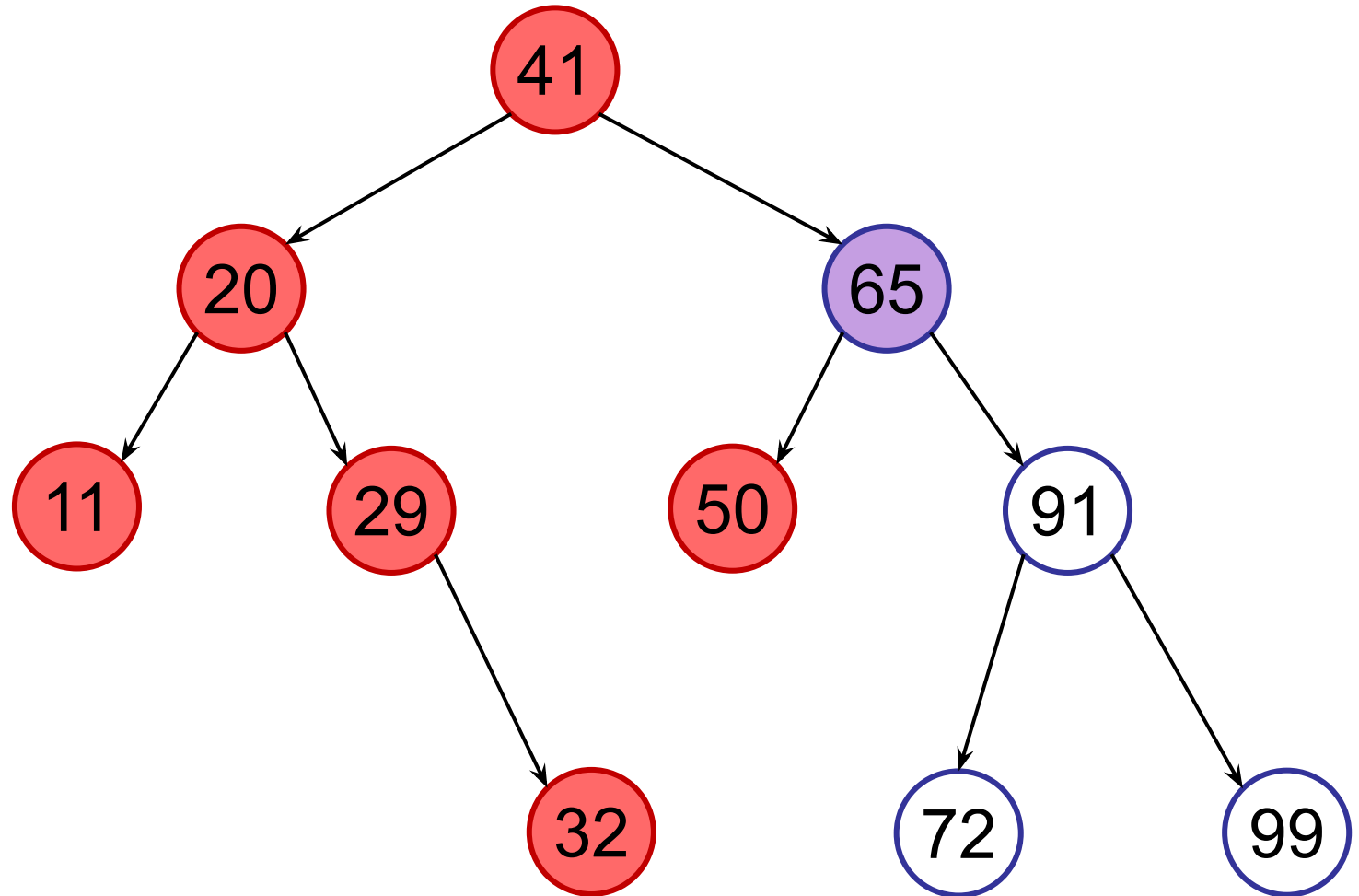
in-order-traversal



# Tree Traversal

---

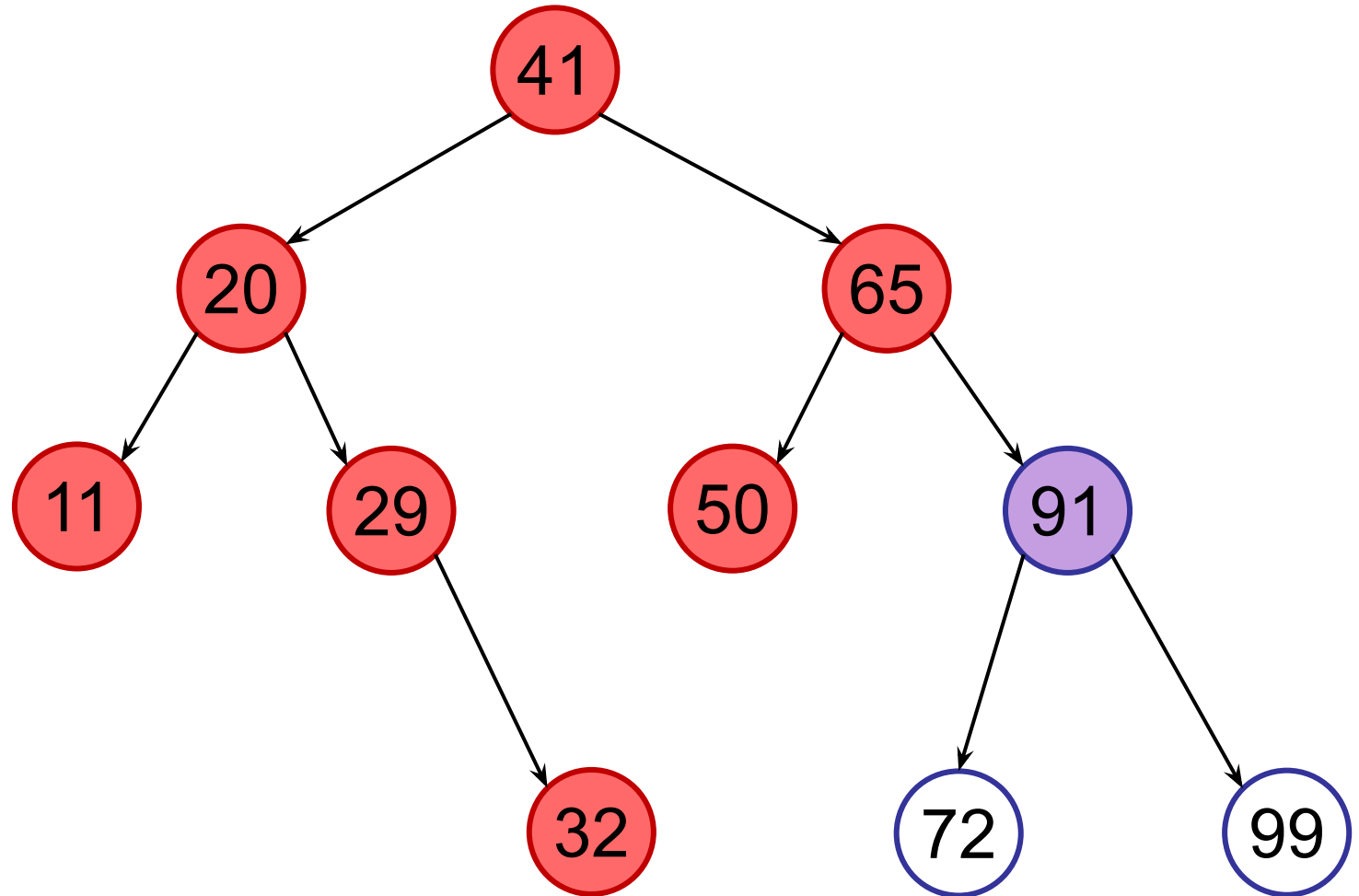
in-order-traversal



# Tree Traversal

---

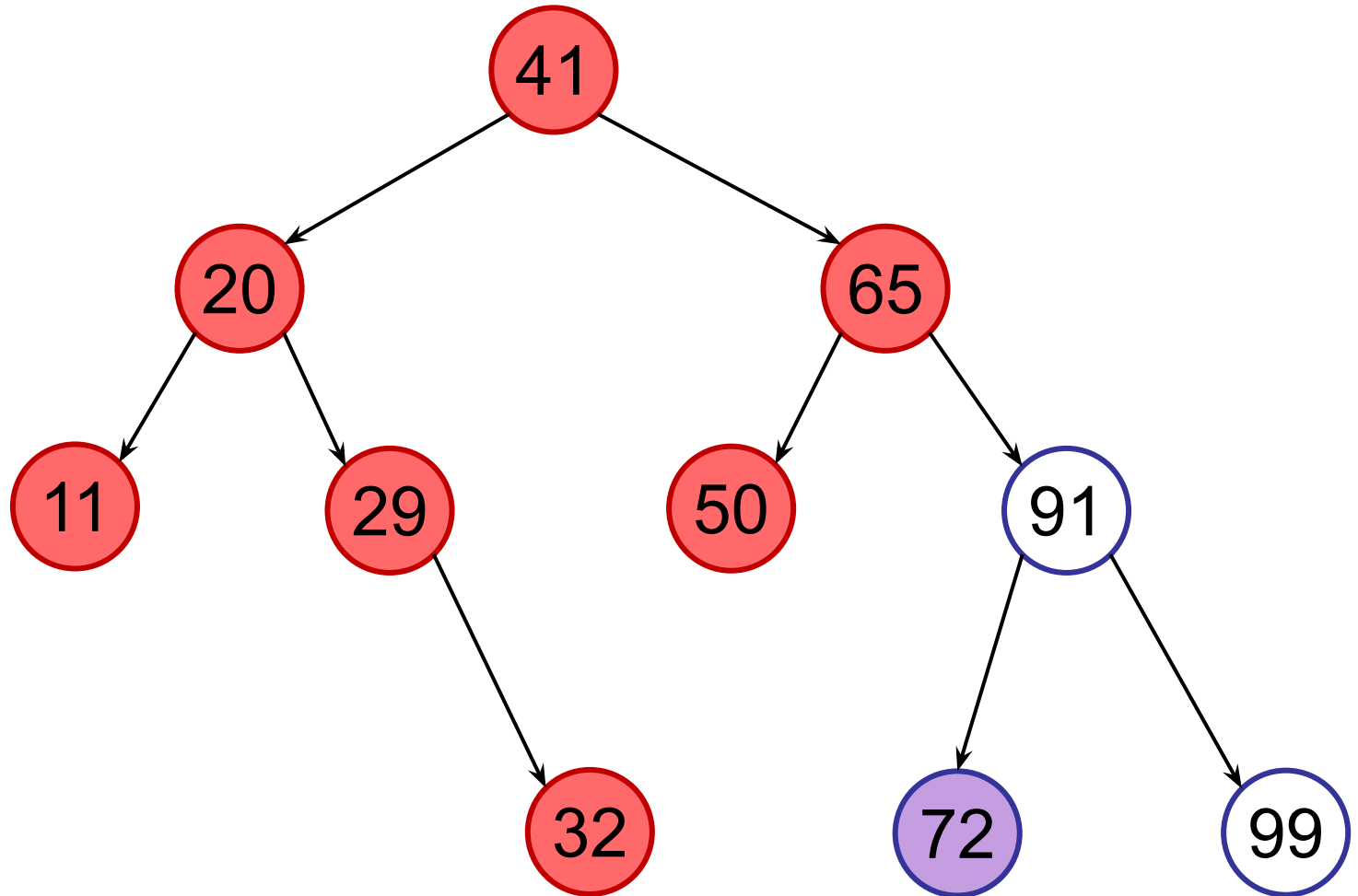
in-order-traversal



# Tree Traversal

---

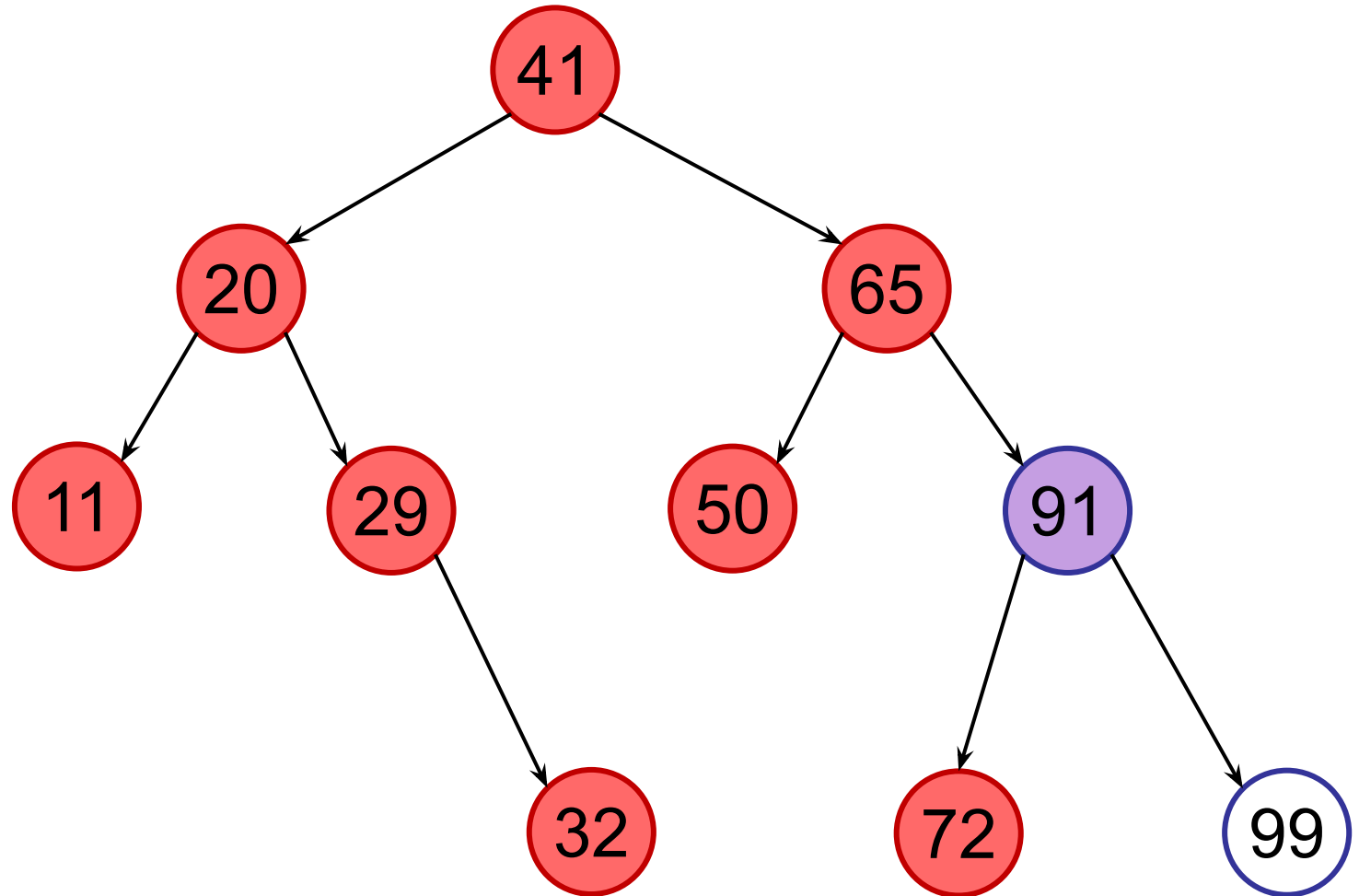
in-order-traversal



# Tree Traversal

---

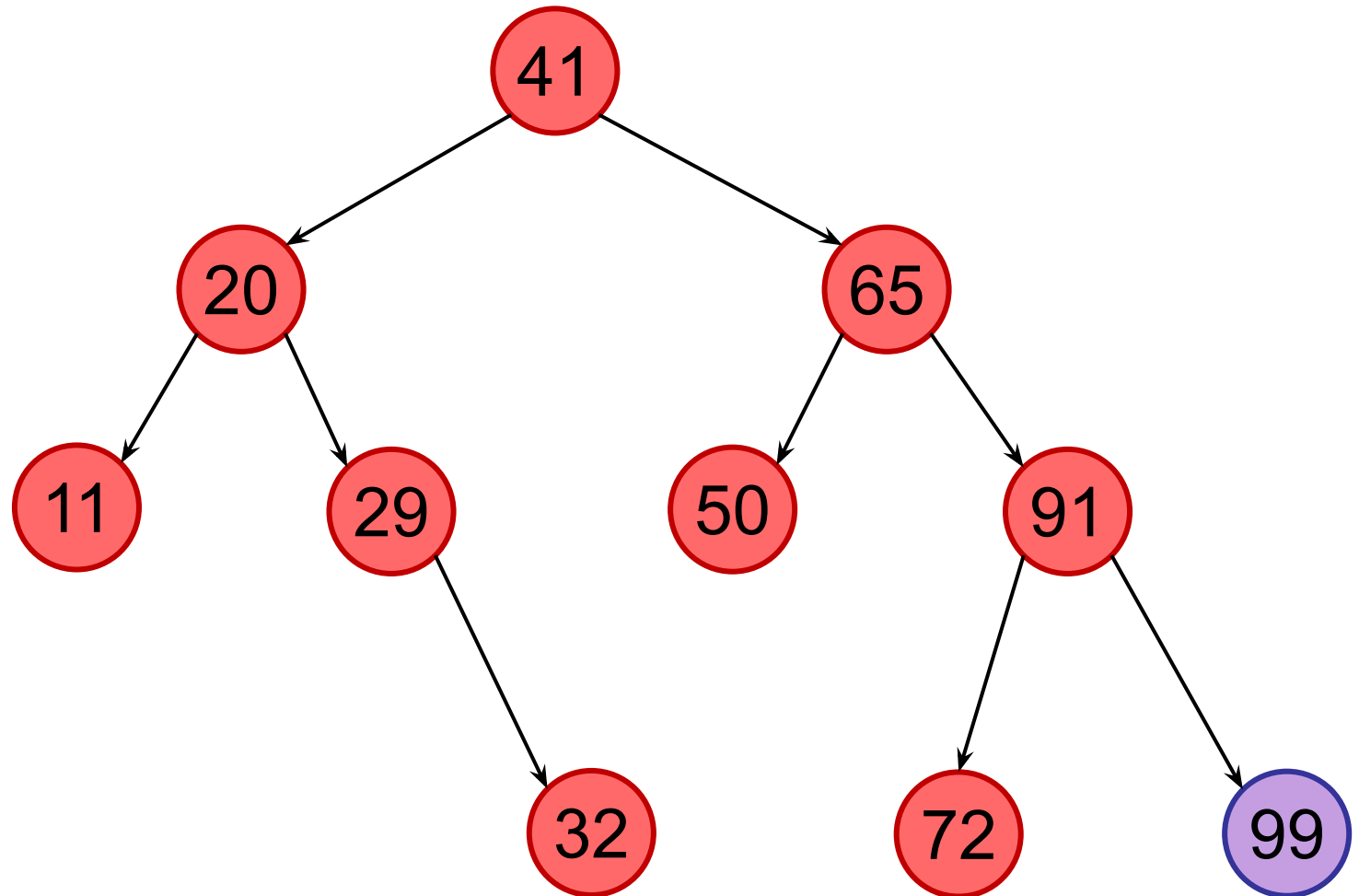
in-order-traversal



# Tree Traversal

---

in-order-traversal

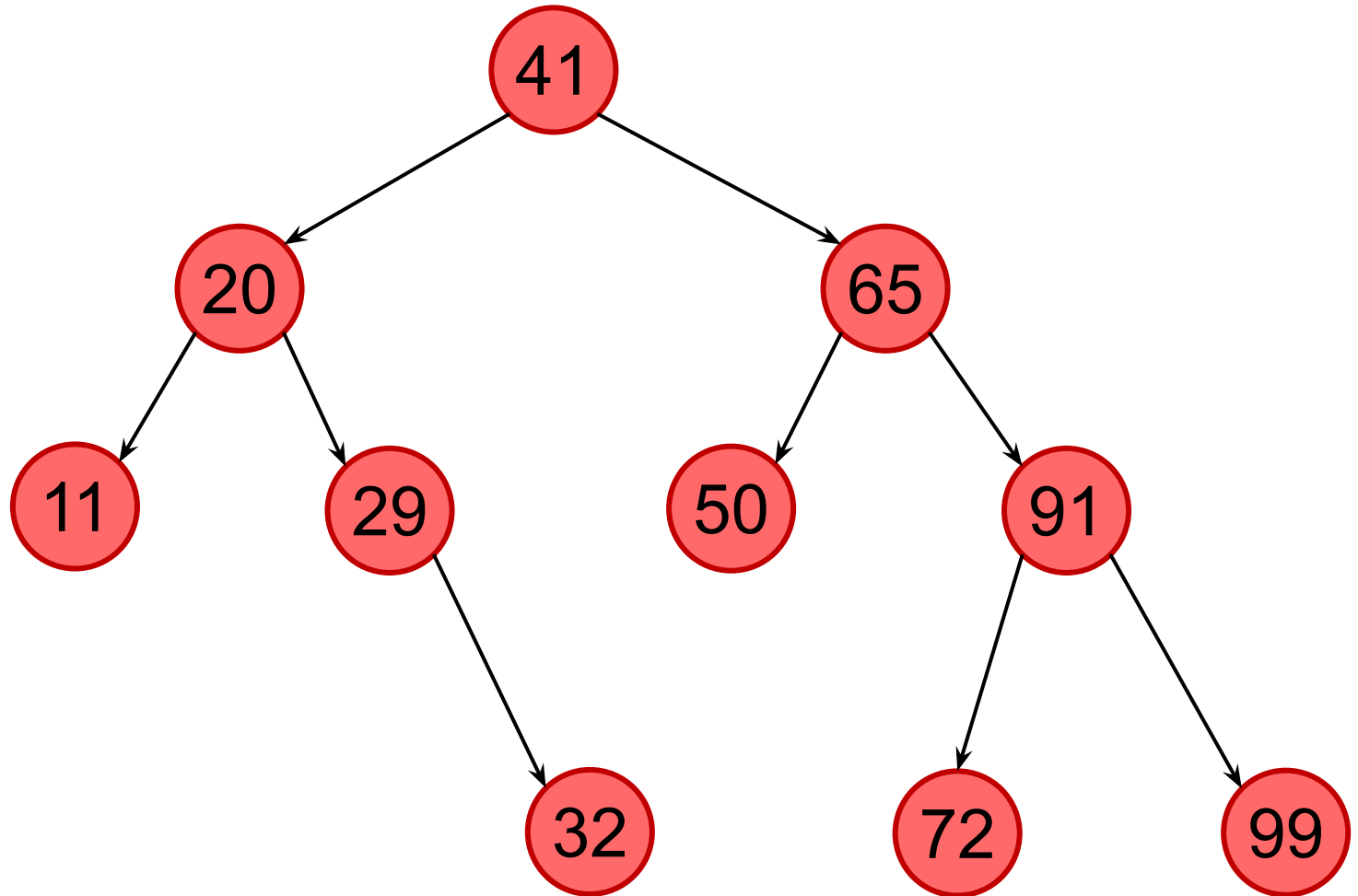




# Tree Traversal

---

in-order-traversal



# Tree Traversal

---

## in-order-traversal(v)

```
public void in-order-traversal() {  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    visit(this);  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

# Tree Traversal

---

## in-order-traversal(v)

```
public void in-order-traversal() {  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    visit(this);  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

# Tree Traversal

---

## in-order-traversal(v)

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public void in-order-traversal() {  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    visit(this);  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

# How long does an in-order-traversal take?

1.  $O(1)$
2.  $O(\log n)$
3.  $O(n)$
4.  $O(n \log n)$
5.  $O(n^2)$
6.  $O(2^n)$

# Tree Traversal

---

## in-order-traversal(v)

```
public void in-order-traversal() {  
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    visit(this);  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

Running time:  $O(n)$

- visits each node at most once

# Tree Traversal

---

## in-order-traversal(v)

```
public void in-order-traversal() {  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    visit(this);  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

Running time:  $O(n)$

- visits each node at most once, each visit costs  $O(1)$

# Tree Traversal

---

## in-order-traversal(v)

```
public void in-order-traversal() {  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    visit(this);  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

Running time:  $O(n)$

- $n$  nodes  $\times O(1)$  work per node =  $O(n)$



How long does an in-order-traversal take?

1.  $O(1)$
2.  $O(\log n)$
3.  $O(n)$
4.  $O(n \log n)$
5.  $O(n^2)$
6.  $O(2^n)$

# Tree Traversal

---

## in-order-traversal(v)

- left-subtree
- SELF
- right-subtree

## pre-order-traversal(v)

- SELF
- left-subtree
- right-subtree

## post-order-traversal(v)

- left-subtree
- right-subtree
- SELF

# Tree Traversals

---

## pre-order-traversal(v)

```
public void pre-order-traversal() {  
    visit(this);  
  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

# Tree Traversals

---

## pre-order-traversal(v)

```
public void pre-order-traversal() {  
    visit(this);  
  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

# Tree Traversals

---

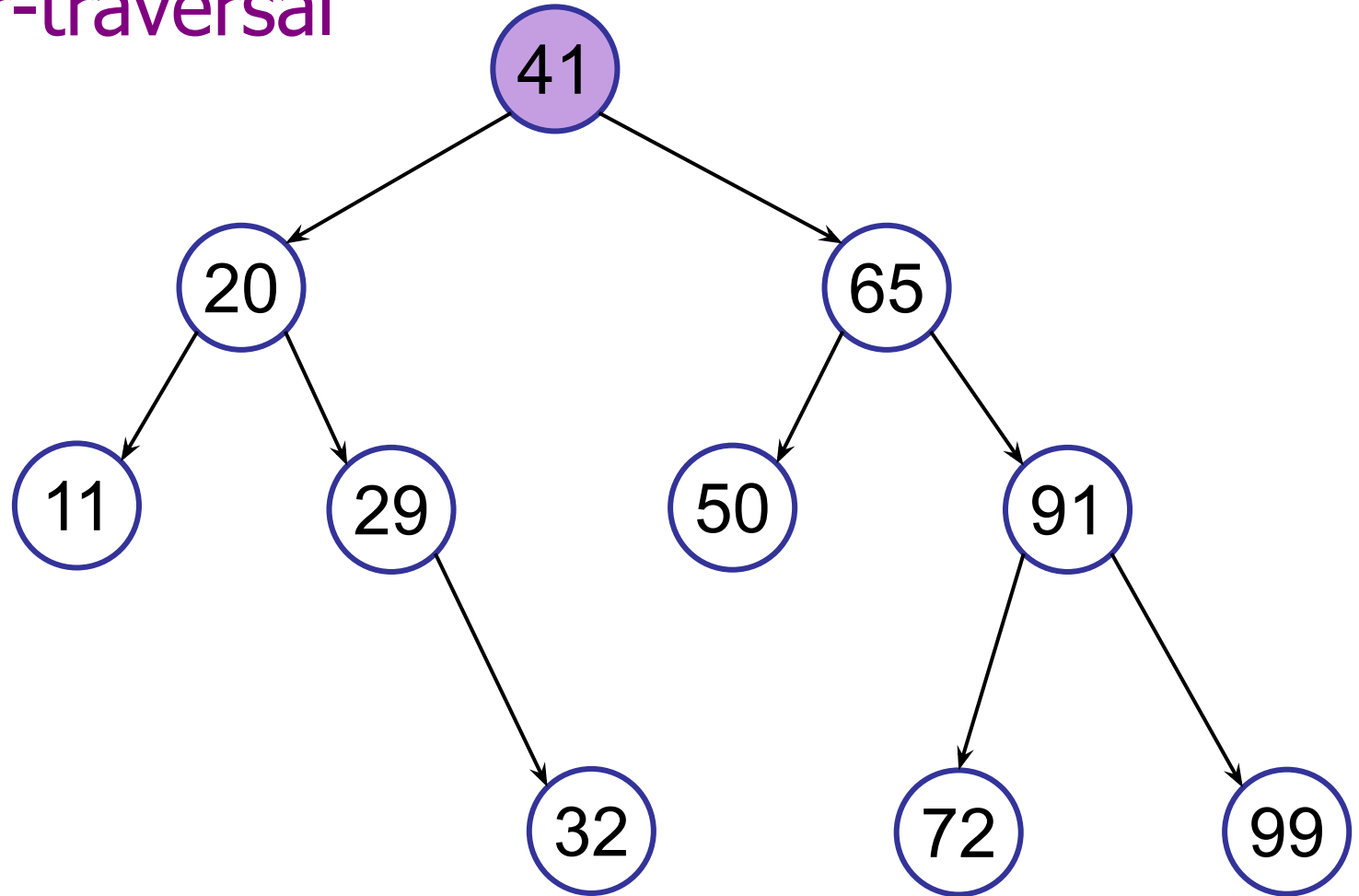
## pre-order-traversal(v)

```
public void pre-order-traversal() {  
    visit(this);  
  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
}
```

# Tree Traversals

---

pre-order-traversal

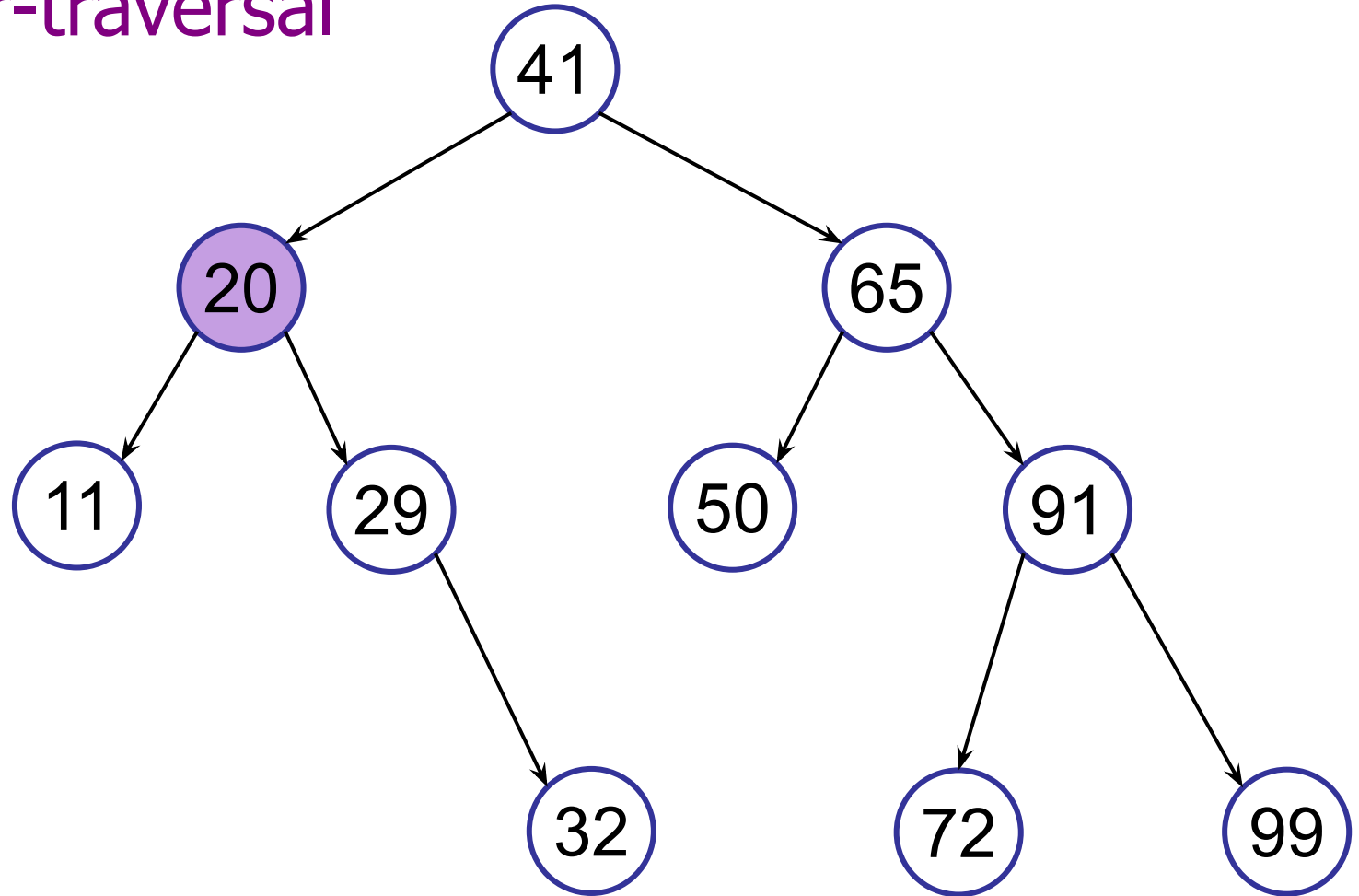


41

# Tree Traversals

---

pre-order-traversal

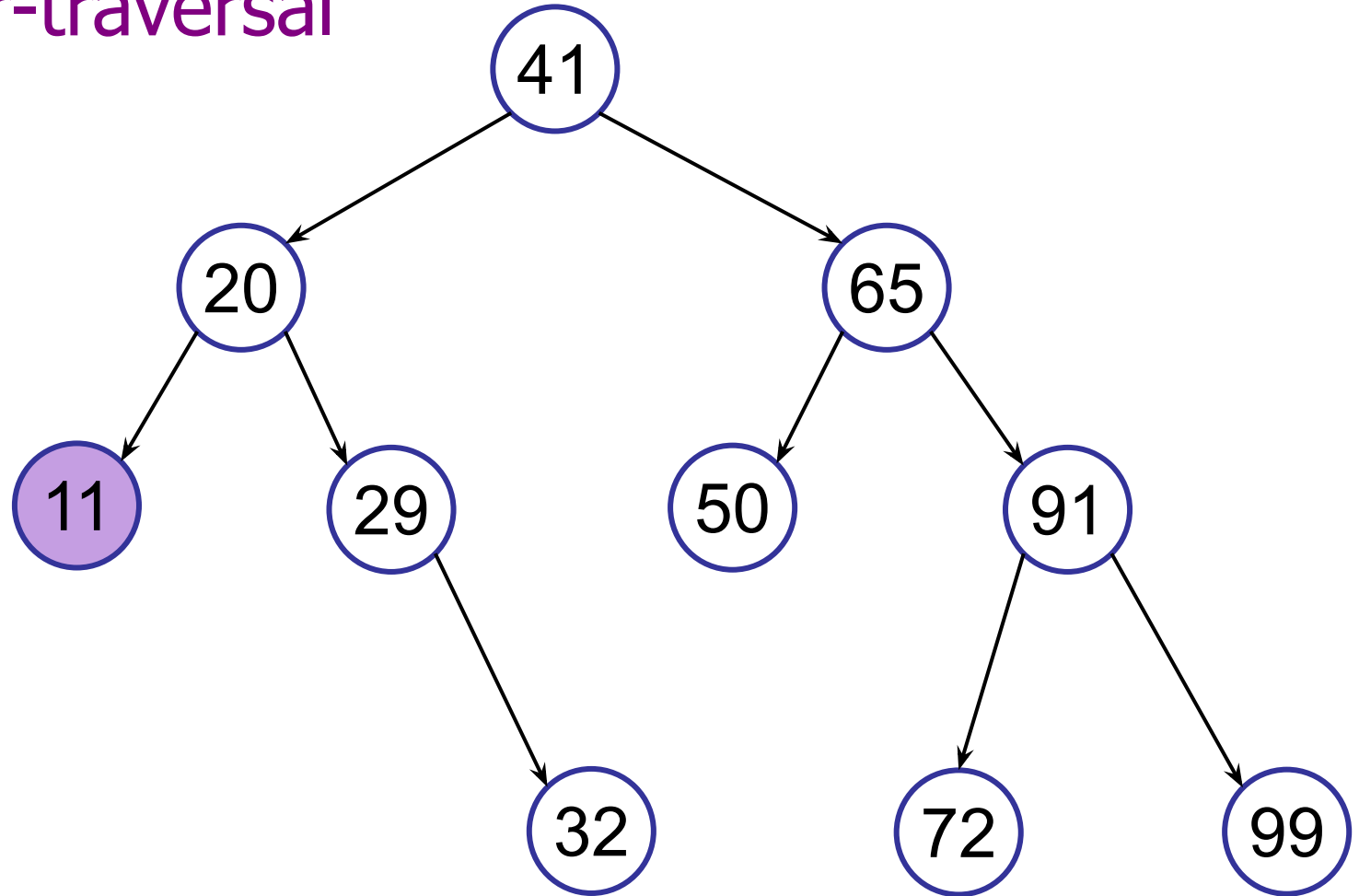


41 20

# Tree Traversals

---

pre-order-traversal



41 20

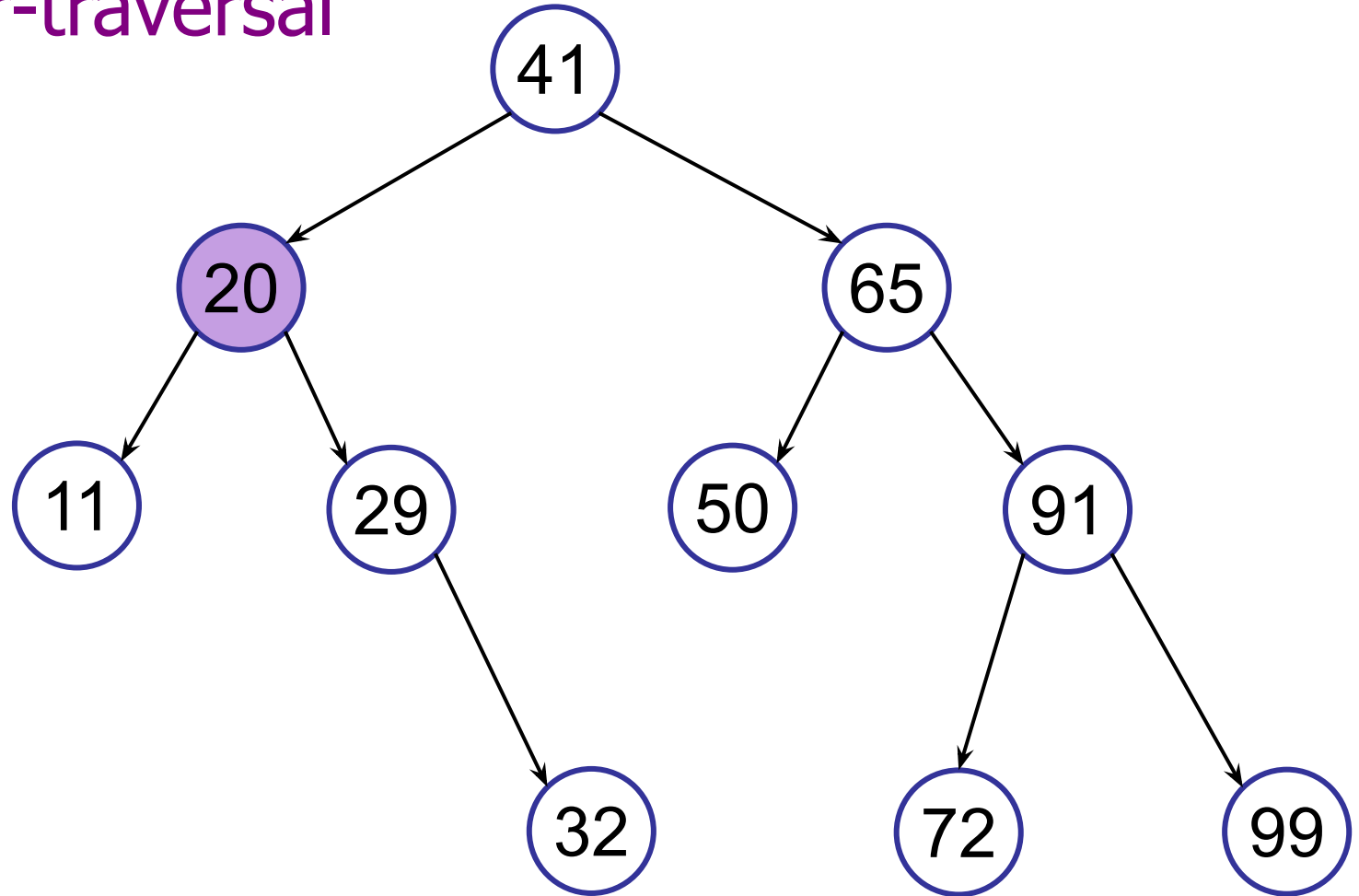
11



# Tree Traversals

---

pre-order-traversal



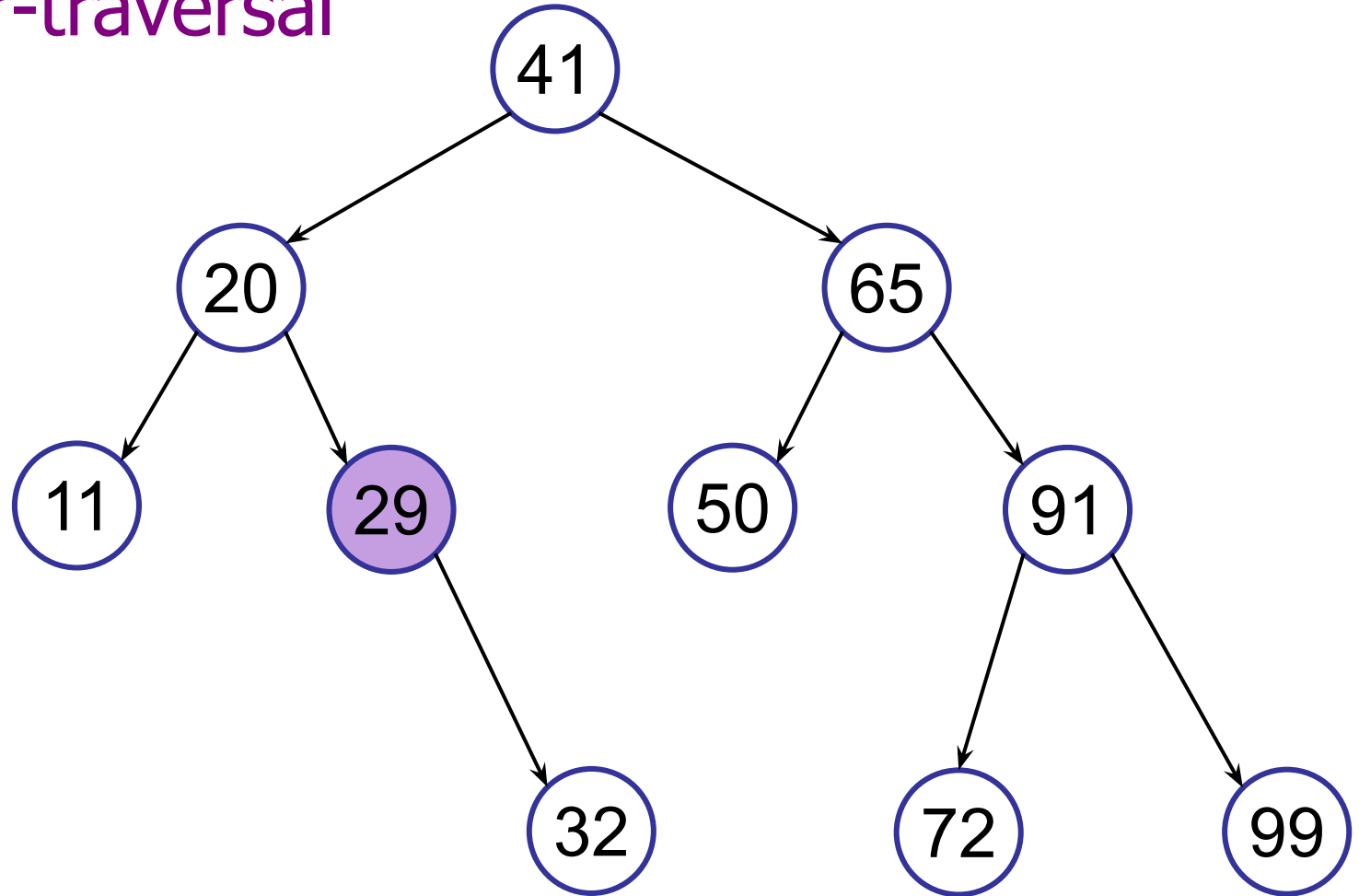
41 20

11

# Tree Traversals

---

pre-order-traversal

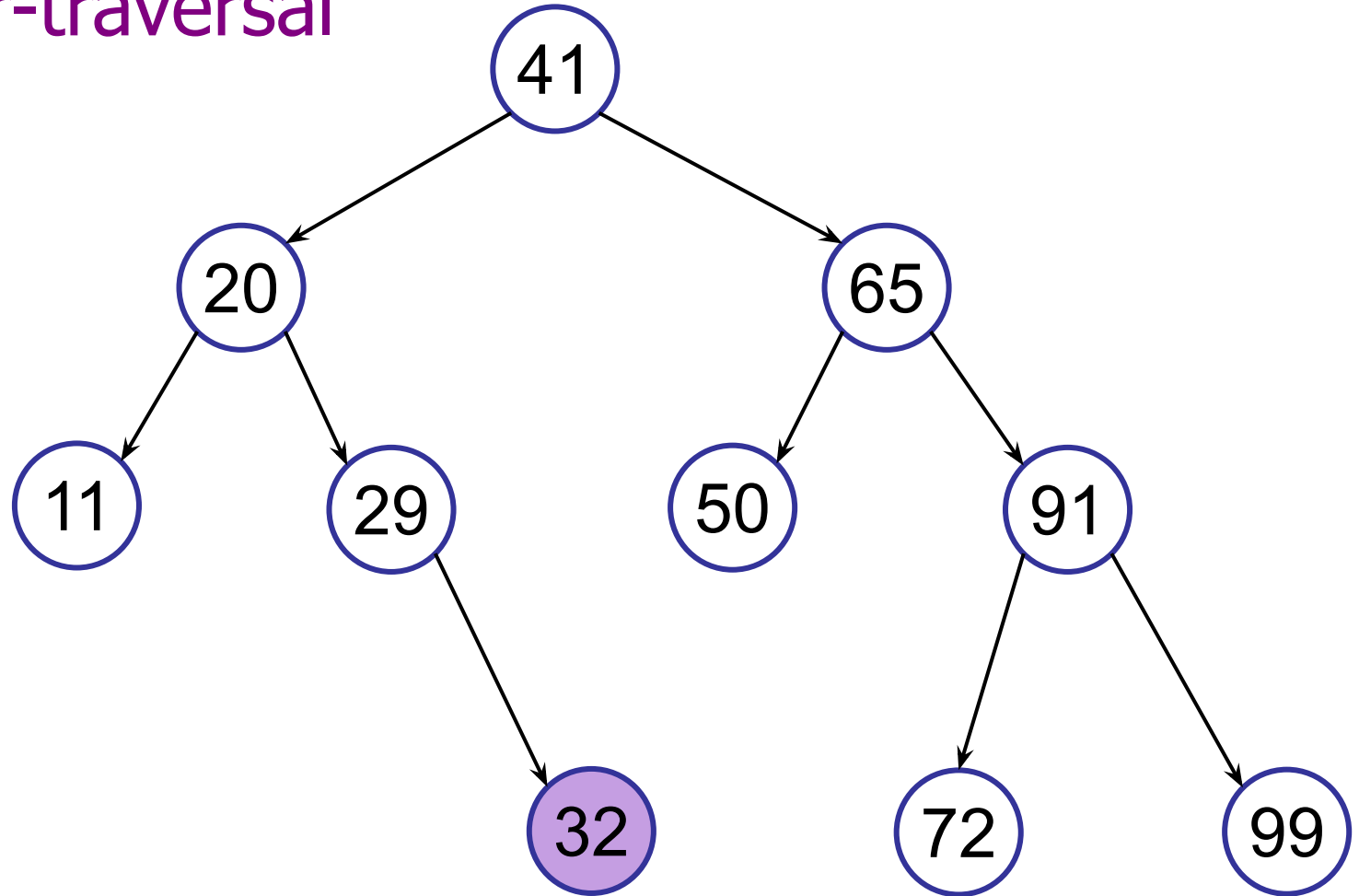


41 20 11 29

# Tree Traversals

---

pre-order-traversal

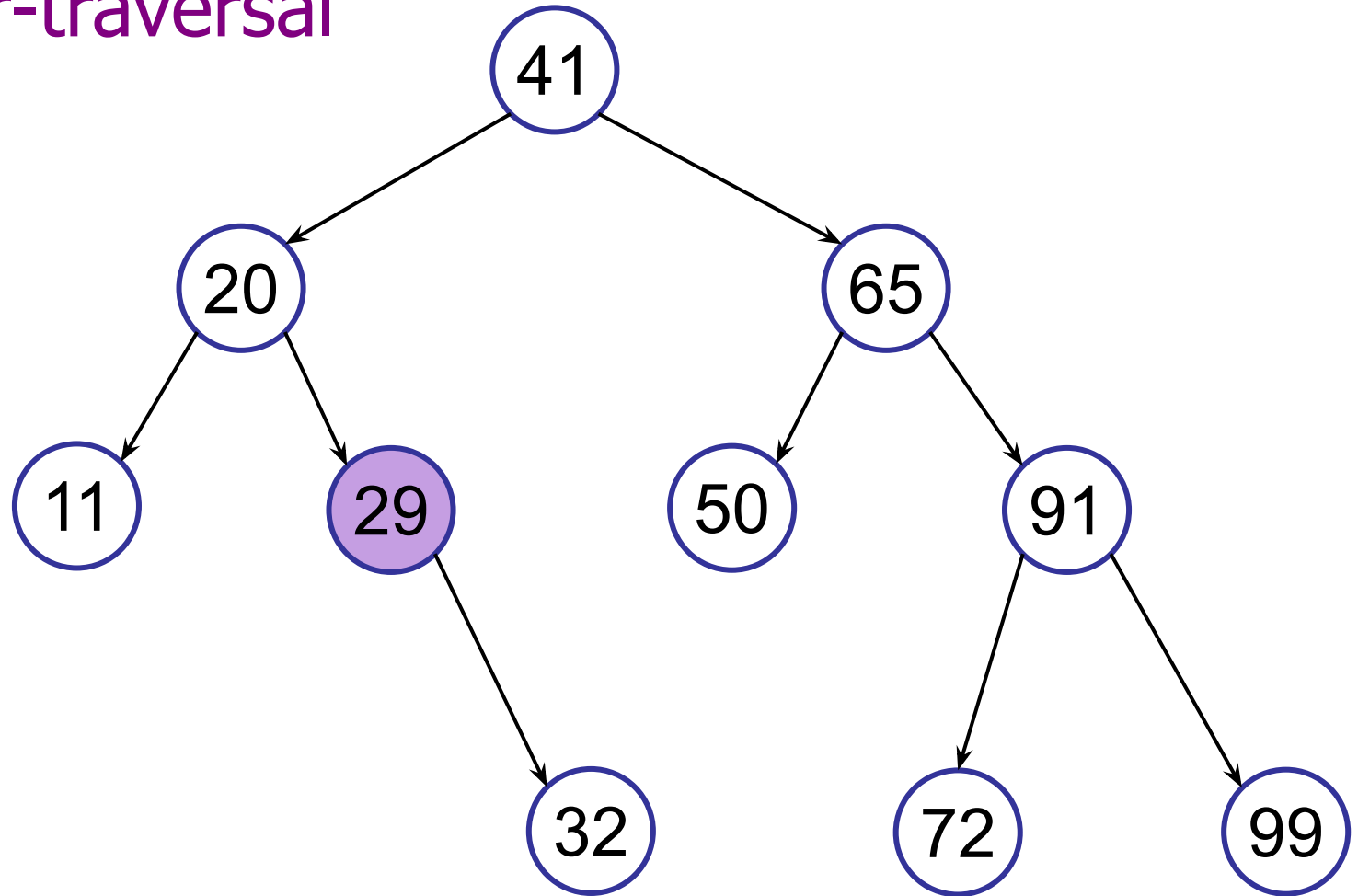


41 20 11 29 32

# Tree Traversals

---

pre-order-traversal

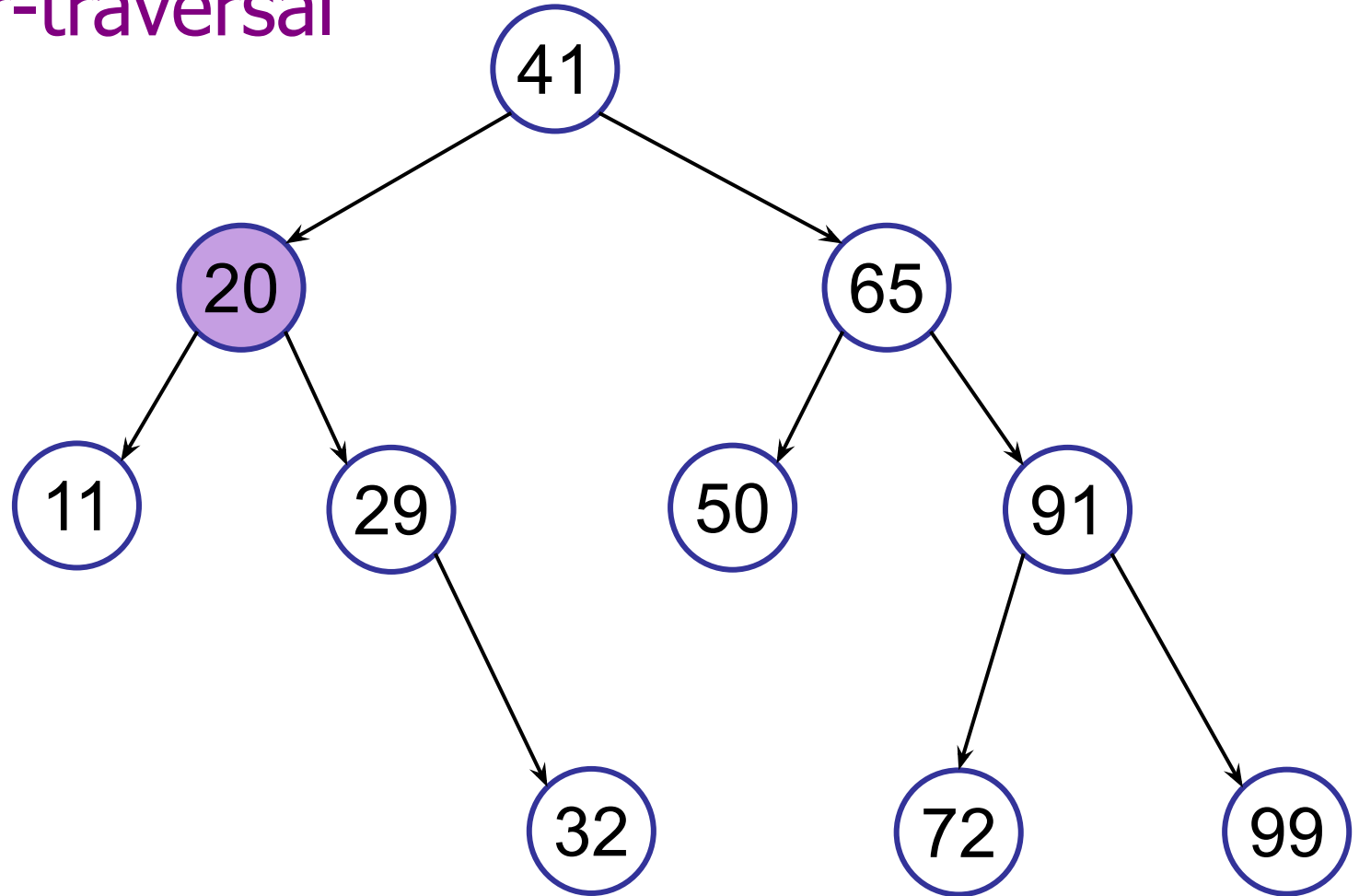


41 20 11 29 32

# Tree Traversals

---

pre-order-traversal

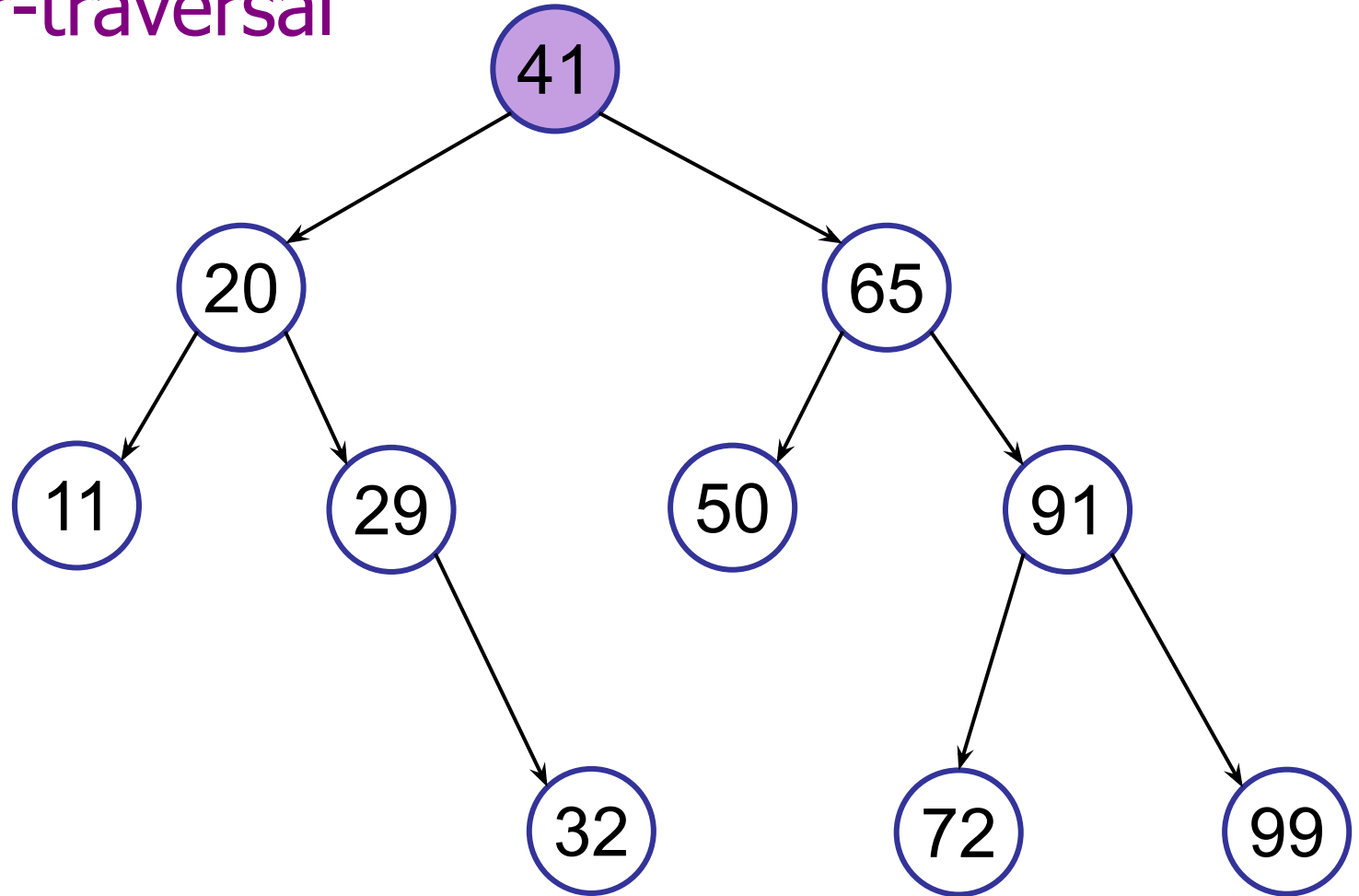


41 20 11 29 32

# Tree Traversals

---

pre-order-traversal

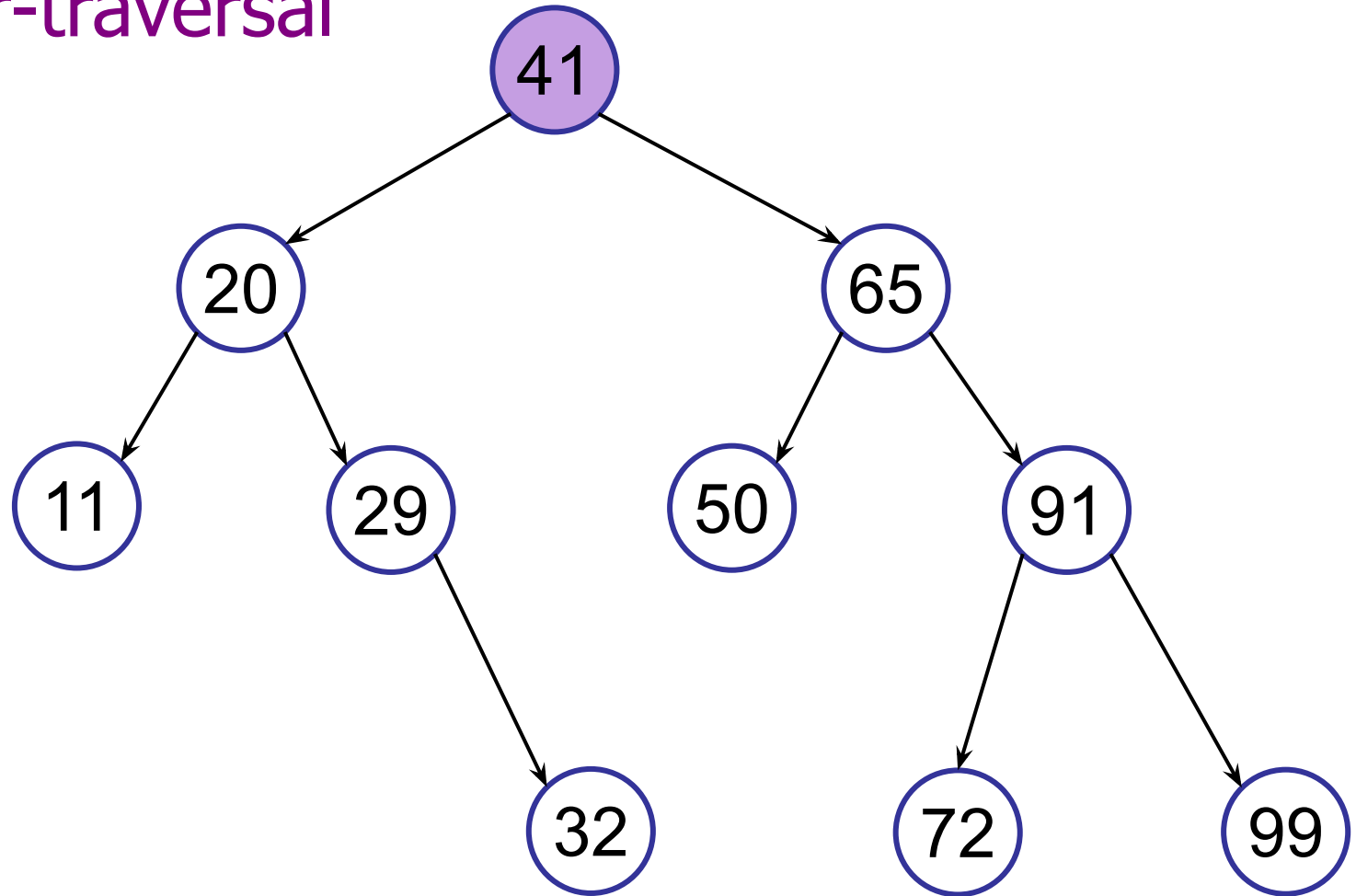


41 20 11 29 32

# Tree Traversals

---

pre-order-traversal



41 20 11 29 32 65 50 91 72 99

# Tree Traversals

---

## post-order-traversal(v)

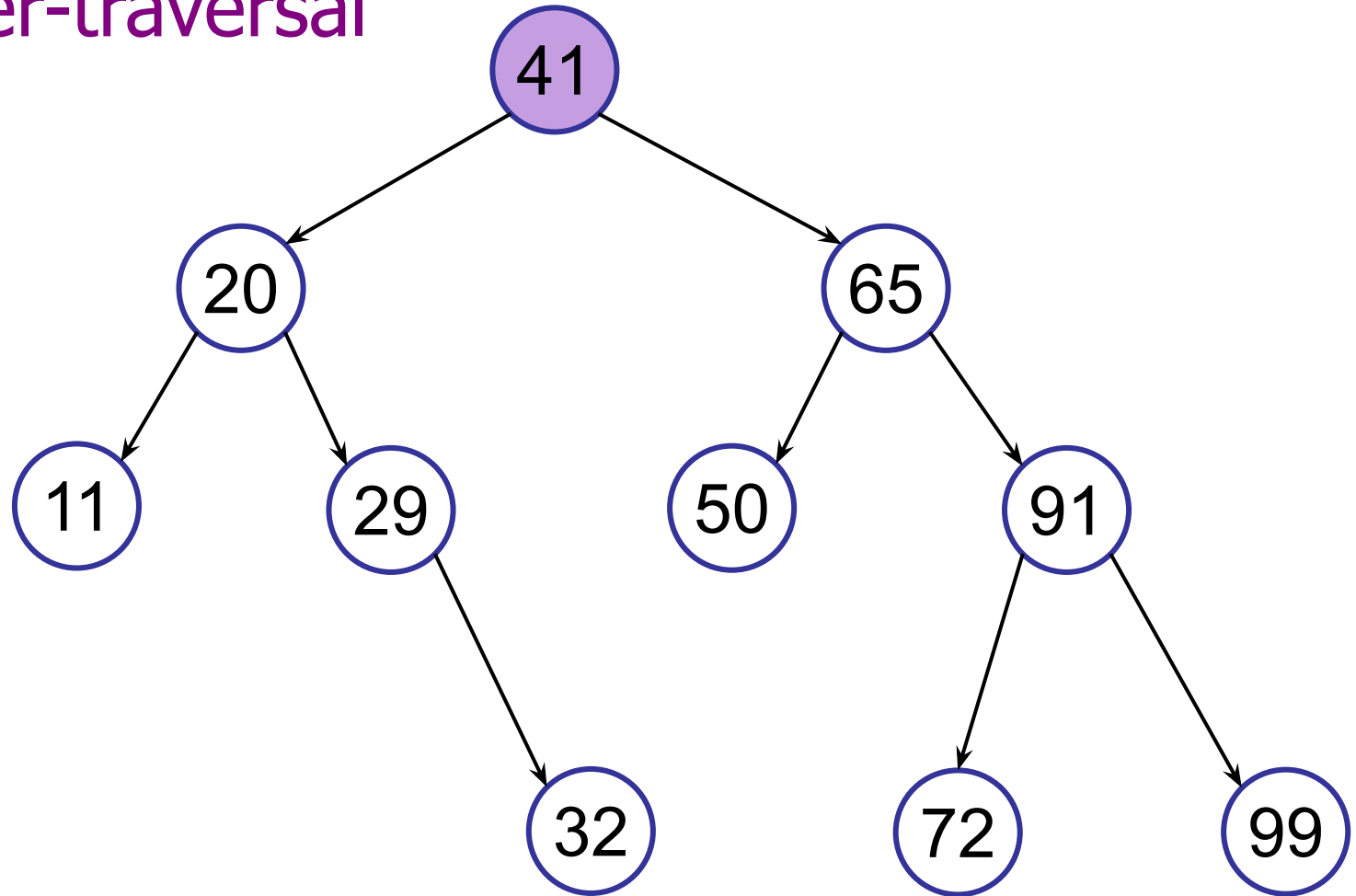
```
public void post-order-traversal() {  
    // Traverse left sub-tree  
    if (leftTree != null)  
        leftTree.in-order-traversal();  
  
    // Traverse right sub-tree  
    if (rightTree != null)  
        rightTree.in-order-traversal();  
  
    visit(this);  
}
```



# Tree Traversals

---

post-order-traversal



11 32 29 20 50 72 99 91 65 41

# Tree Traversals

---

1. In-order

2. Pre-order

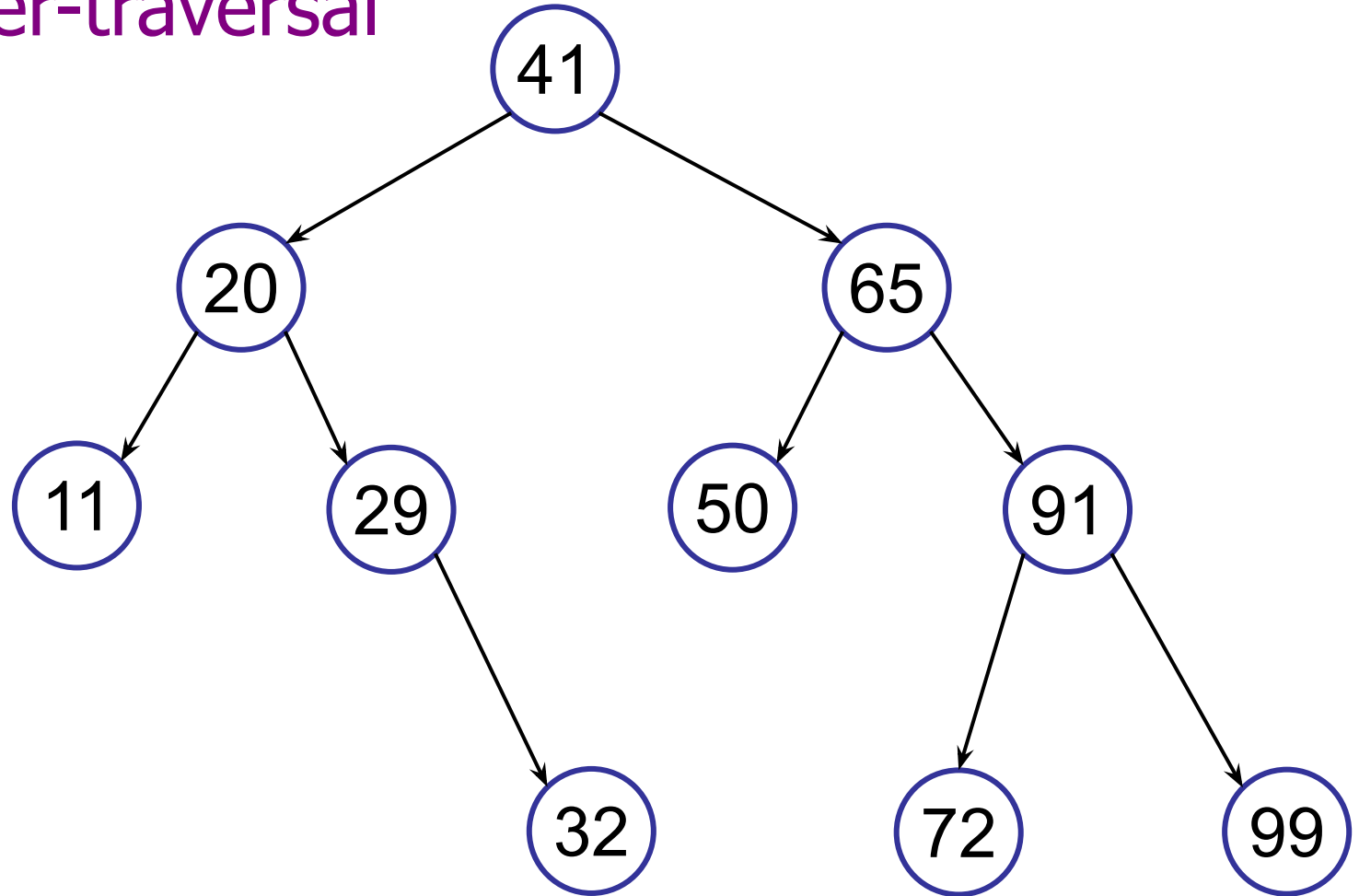
3. Post-order

4. Level-Order traversal  New!

# Tree Traversals

---

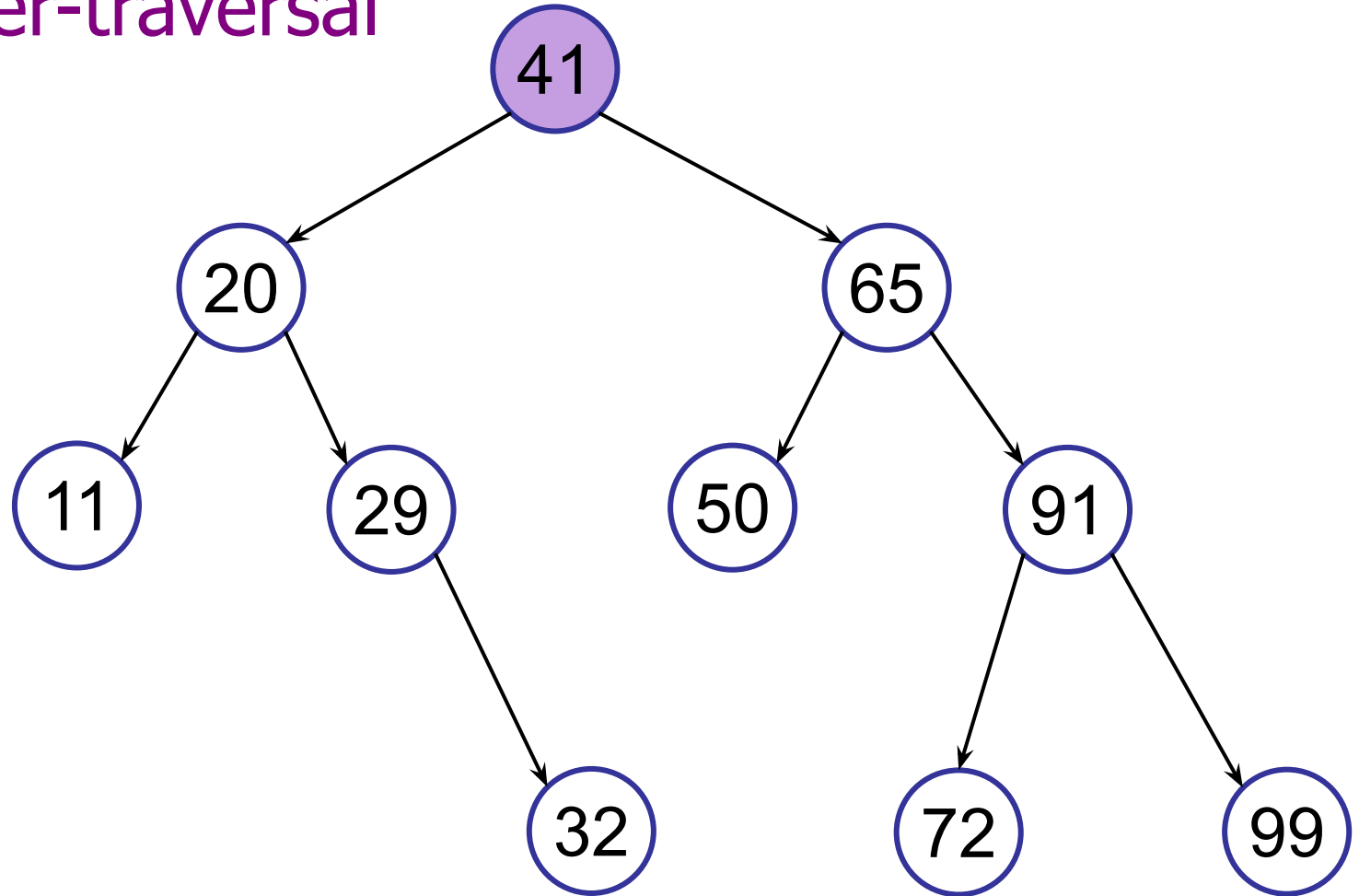
level-order-traversal



# Tree Traversals

---

level-order-traversal

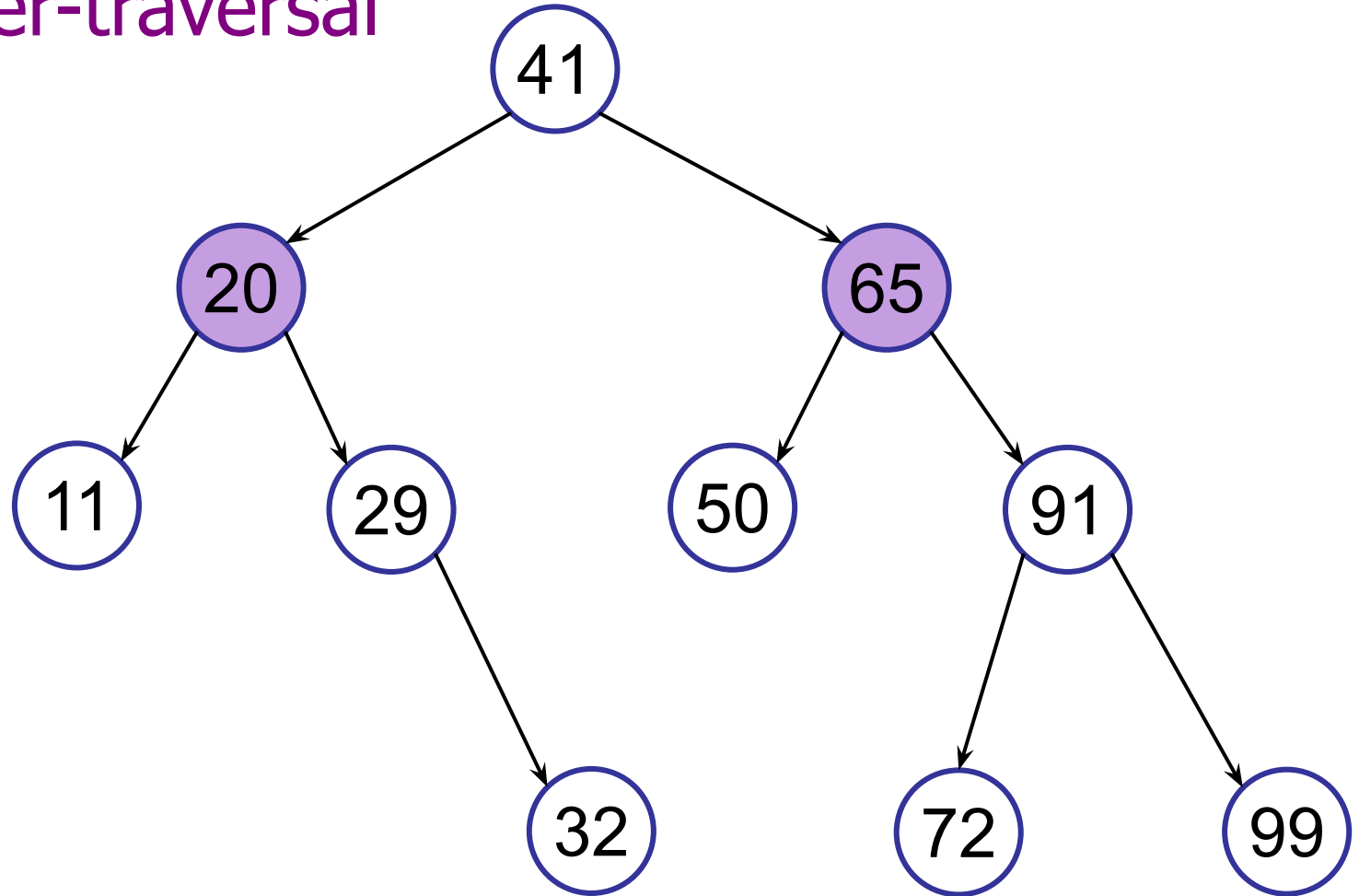


41

# Tree Traversals

---

level-order-traversal

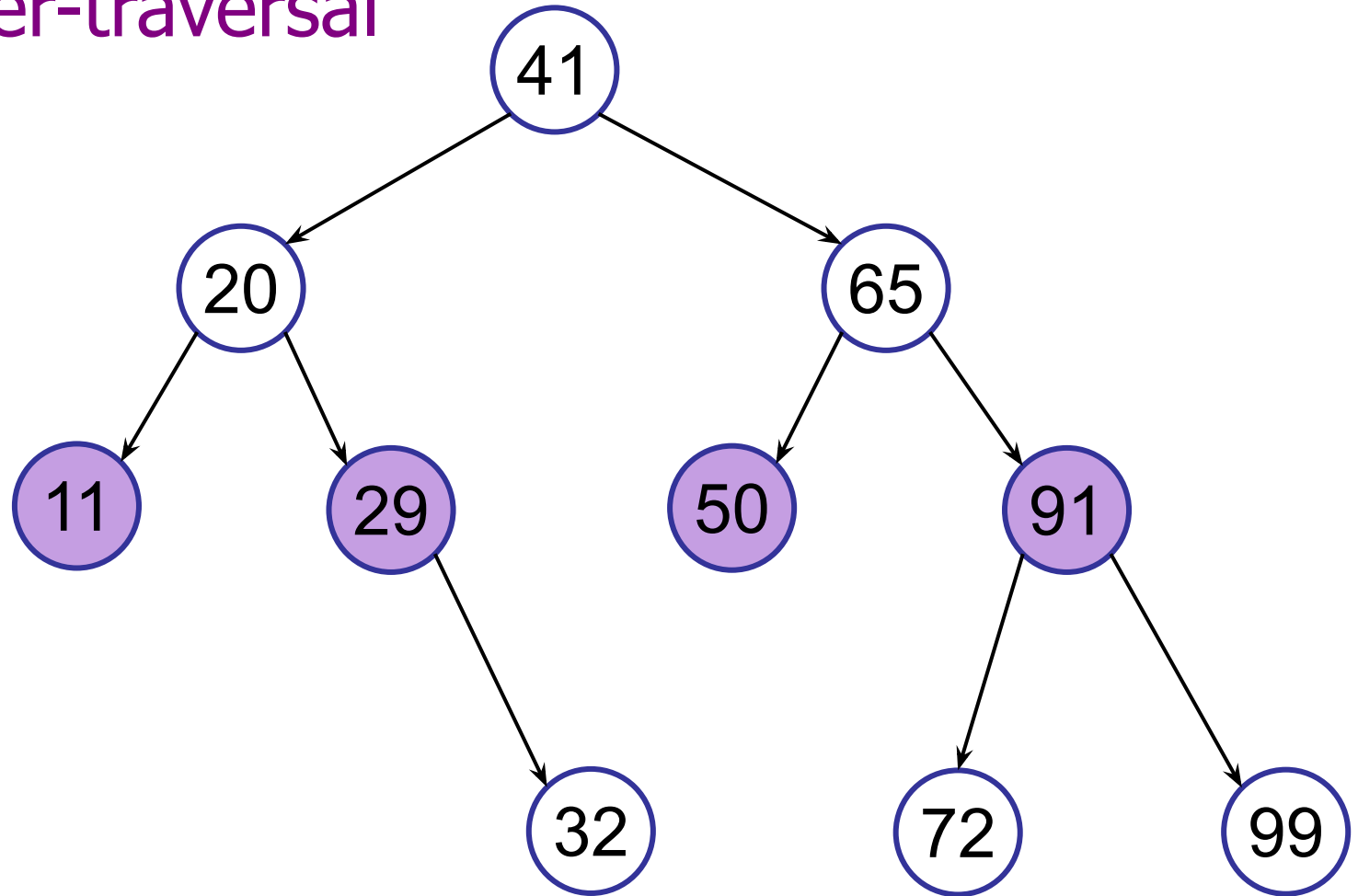


41 20 65

# Tree Traversals

---

level-order-traversal

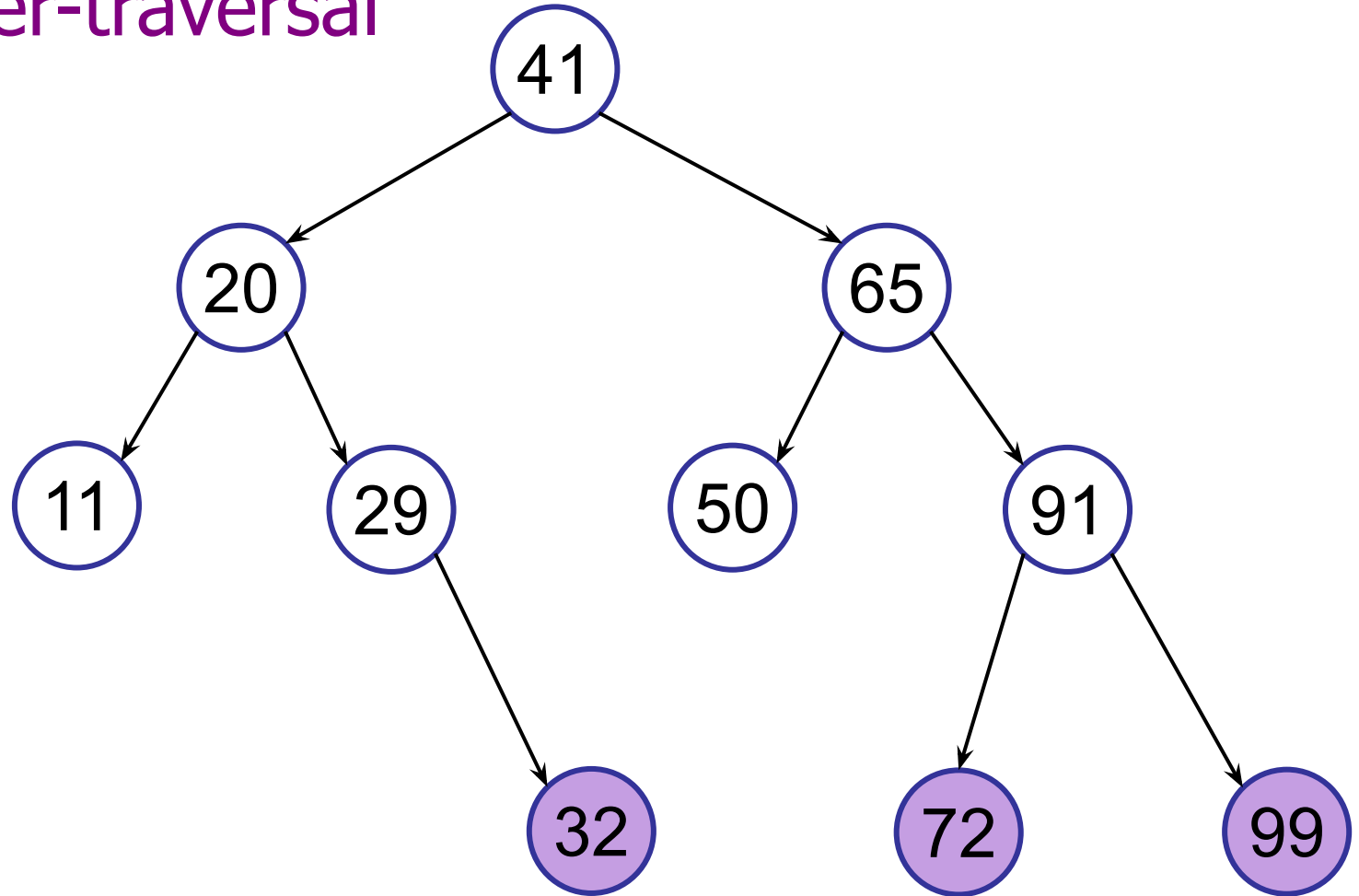


41 20 65 11 29 50 91

# Tree Traversals

---

level-order-traversal

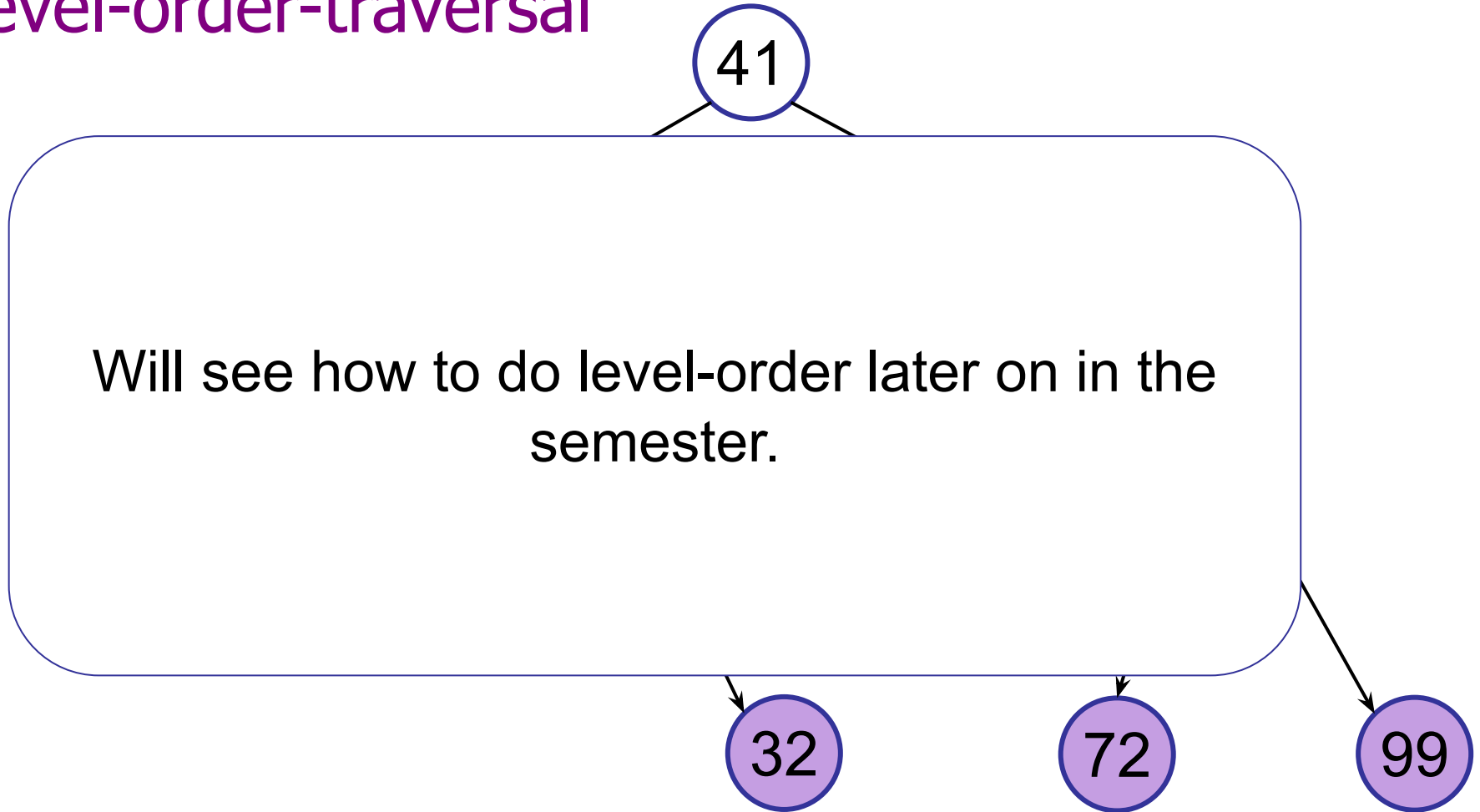


41 20 65 11 29 50 91 32 72 99

# Tree Traversals

---

## level-order-traversal



41 20 65 11 29 50 91 32 72 99



# Binary Search Trees

---

## 1. Terminology and Definitions

## 2. Basic operations:

- height
- searchMin, searchMax
- search, insert

## 3. Traversals

- in-order, pre-order, post-order

## 4. Other operations

# Airport Scheduling

---

## Dictionary

6:35	7:00	7:19	8:21	12:21	14:23	14:42			
------	------	------	------	-------	-------	-------	--	--	--

Example:

Storing plane departure times in 2400h format in our dictionary.

# Airport Scheduling

---

## Dictionary

6:35	7:00	7:19	8:21	12:21	14:23	14:42			
------	------	------	------	-------	-------	-------	--	--	--

Use case:

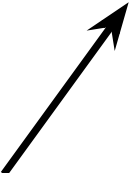
Given some time  $t$ , we want to find the next plane that is going to take off.

# Airport Scheduling

---

## Dictionary

6:35	7:00	7:19	8:21	12:21	14:23	14:42			
------	------	------	------	-------	-------	-------	--	--	--

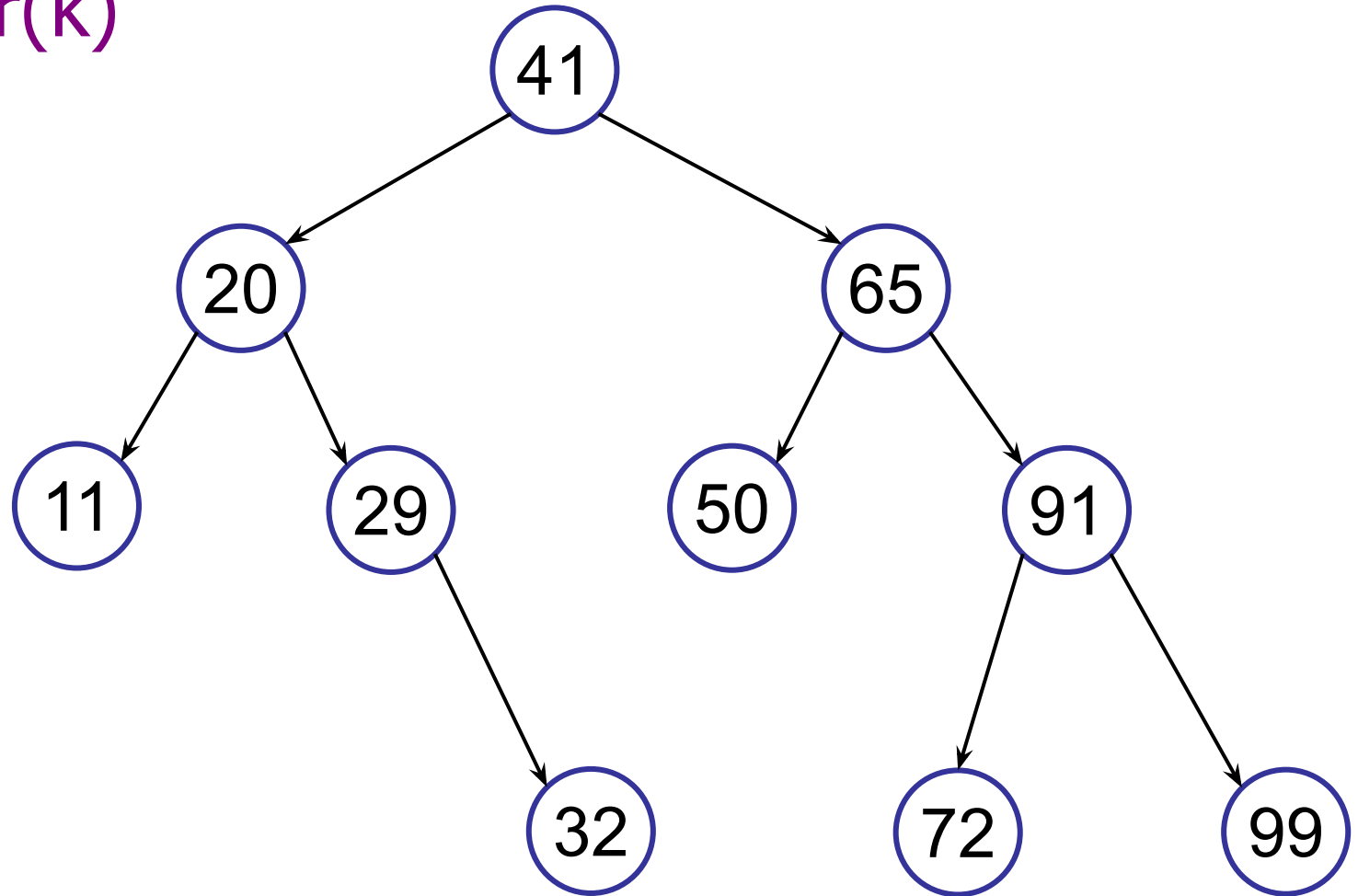
- $\text{successor}(8:24) = 12:21$
- 

How do we implement this?

# Successor: Key not in the Tree

---

successor(k)

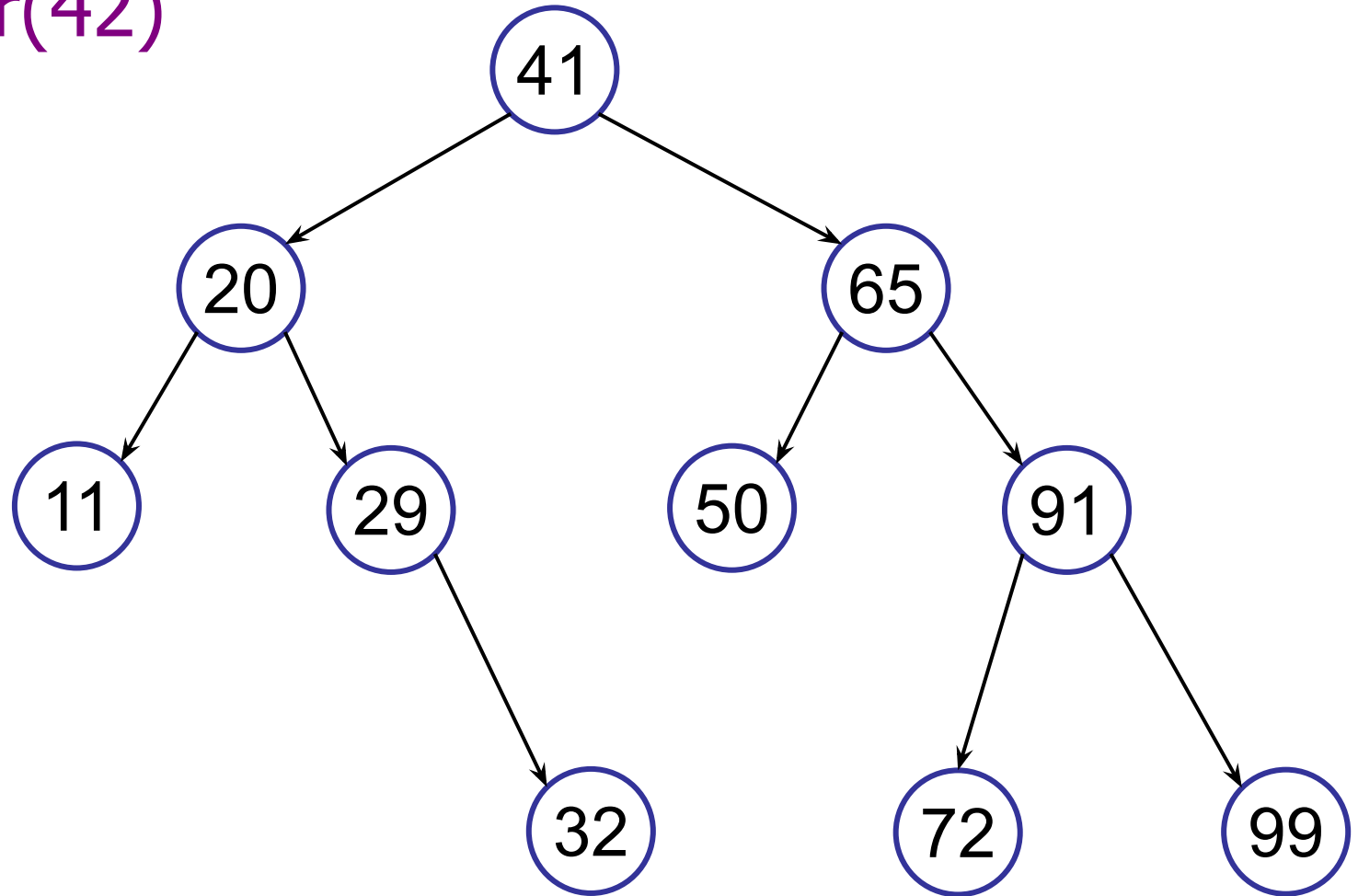


2 possible cases: Either  $k$  is in the tree or it's not

# Successor: Key not in the Tree

---

successor(42)

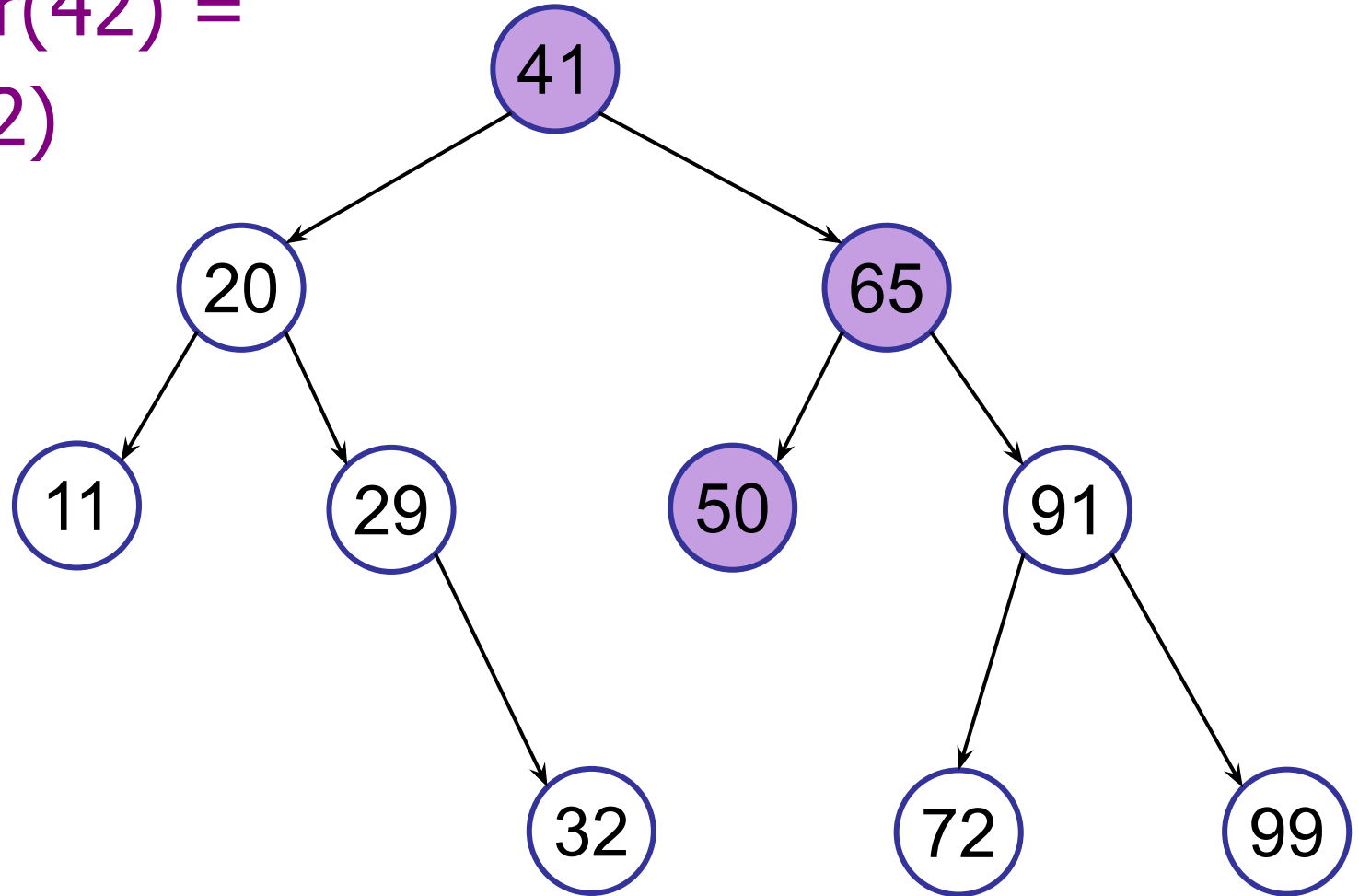


E.g. Key 42 is not in the tree

# Successor: Key not in the Tree

---

successor(42) =  
search(42)

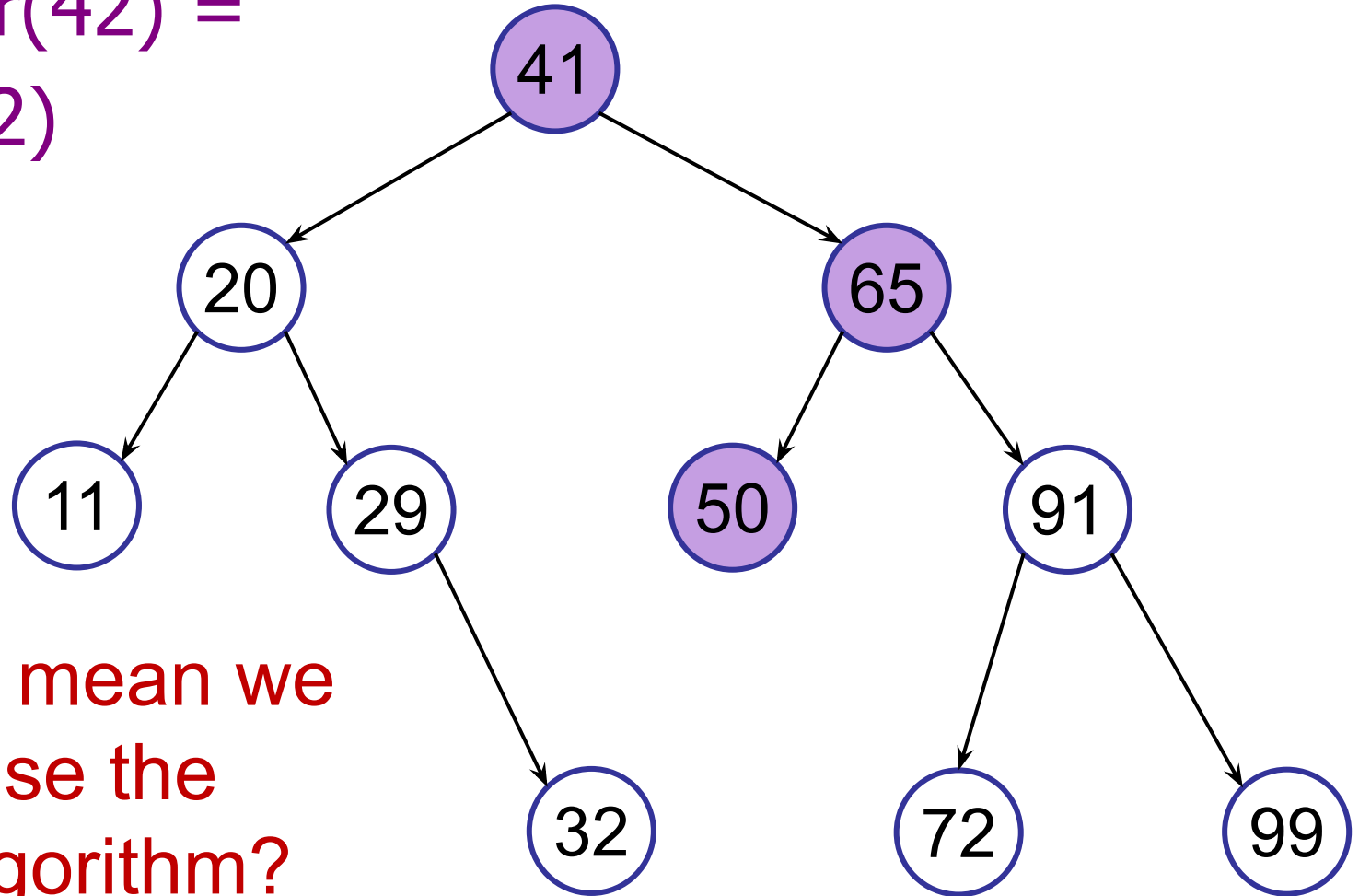


E.g. Key 42 is not in the tree

# Successor: Key not in the Tree

---

successor(42) =  
search(42)



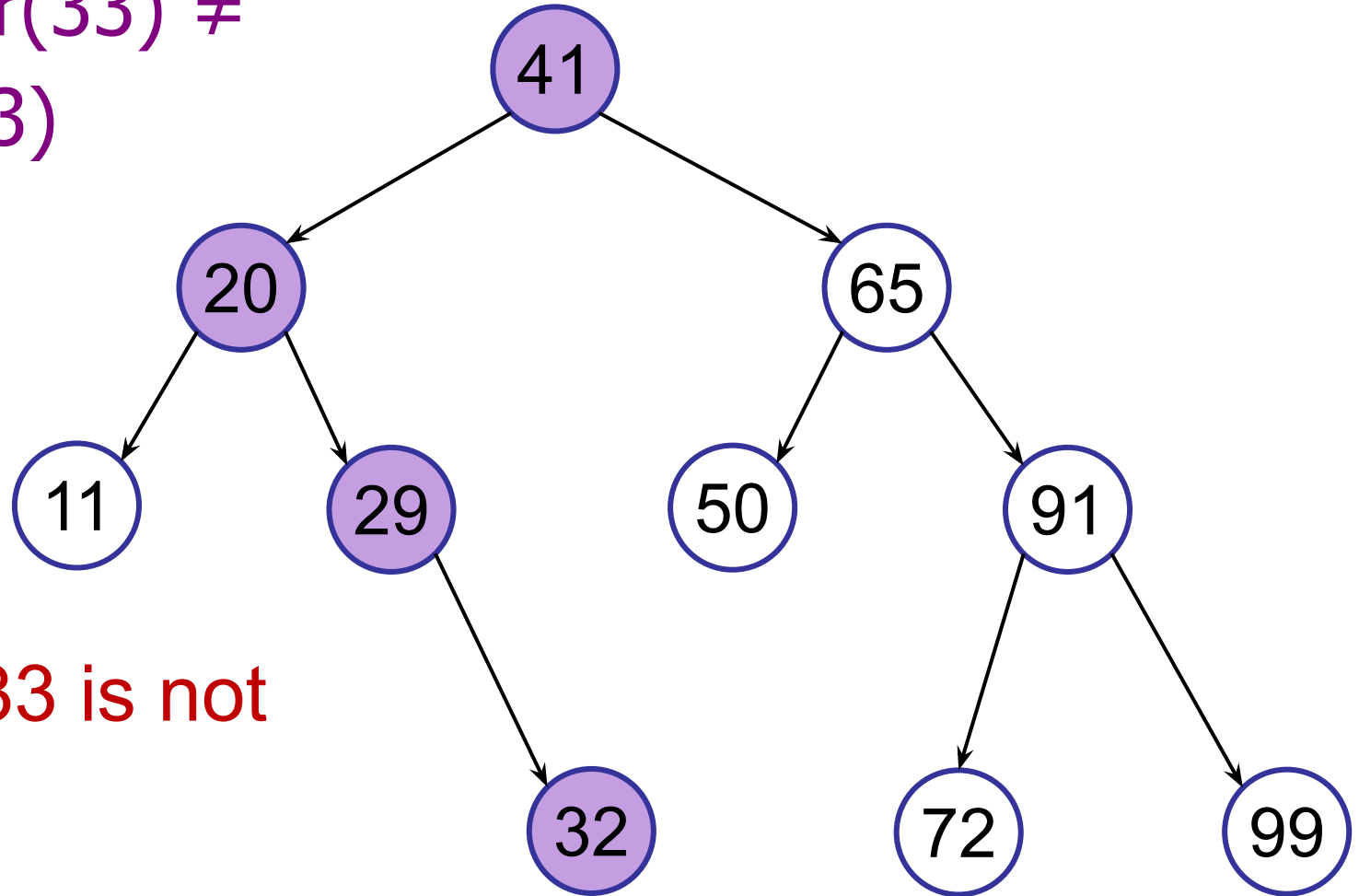
Does this mean we  
can just use the  
search algorithm?



# Successor: Key not in the Tree

---

successor(33)  $\neq$   
search(33)

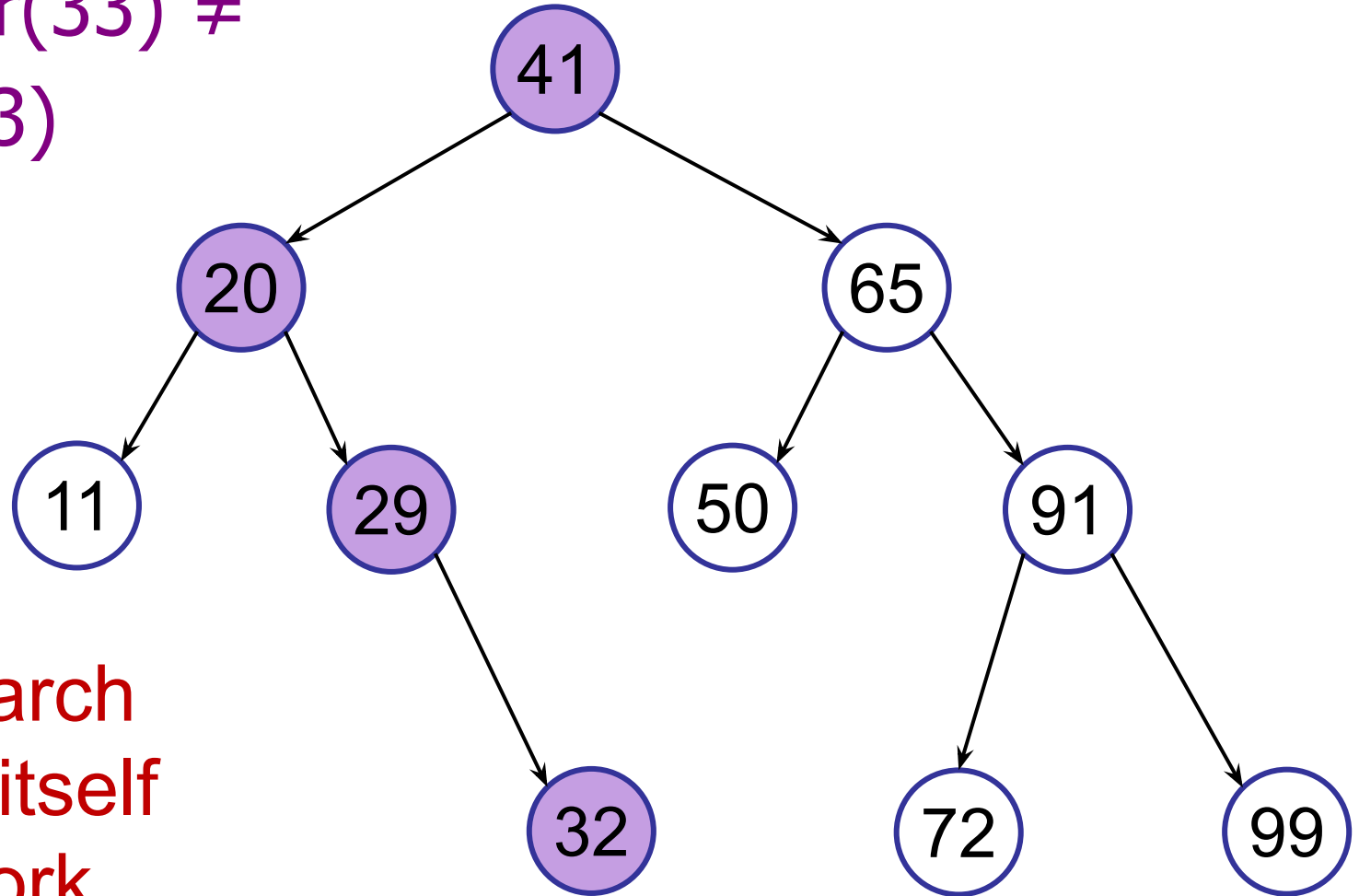


E.g. Key 33 is not  
in the tree

# Successor: Key not in the Tree

---

successor(33)  $\neq$   
search(33)



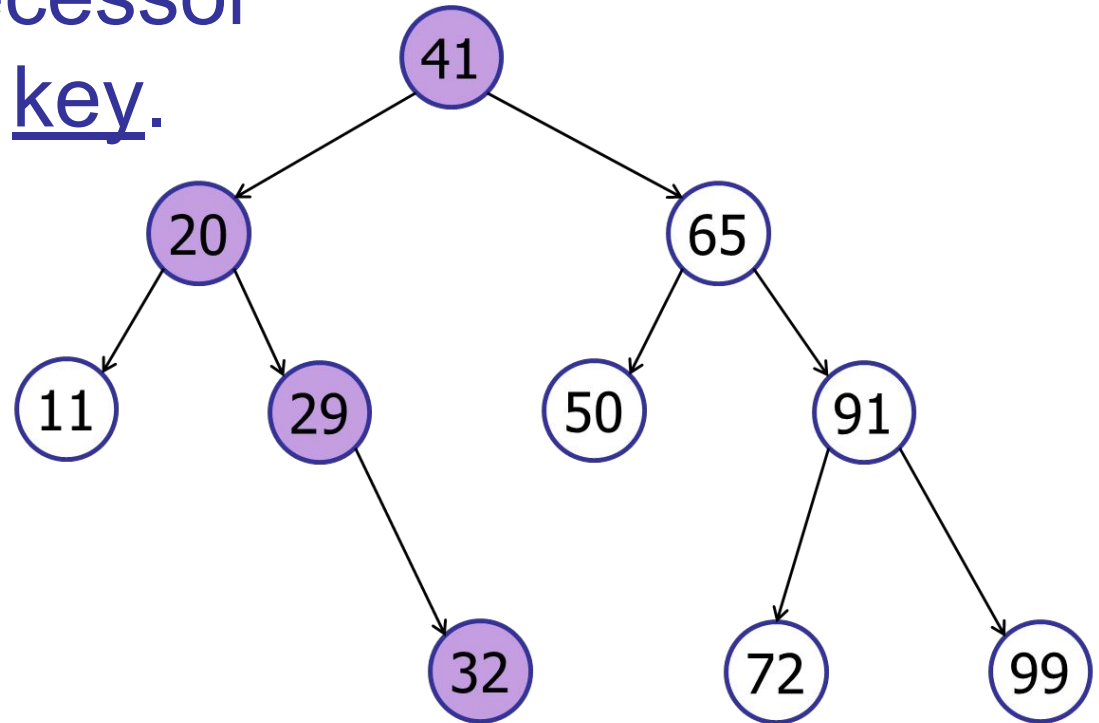
So the search  
algorithm itself  
doesn't work  
to find successors

# Successor: Key not in the Tree

---

But notice: If you search for key not in the tree:

- Either find predecessor or successor of key.



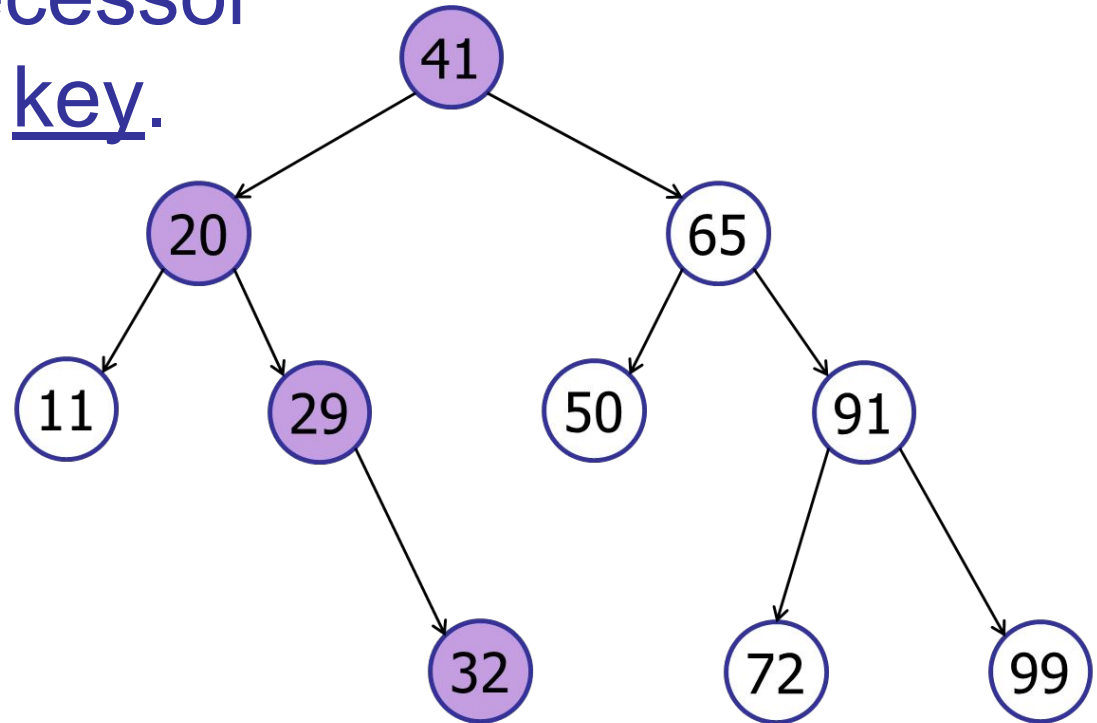
# Successor: Key not in the Tree

---

But notice: If you search for key not in the tree:

- Either find predecessor or successor of key.

Why?



# Successor: Key not in the Tree

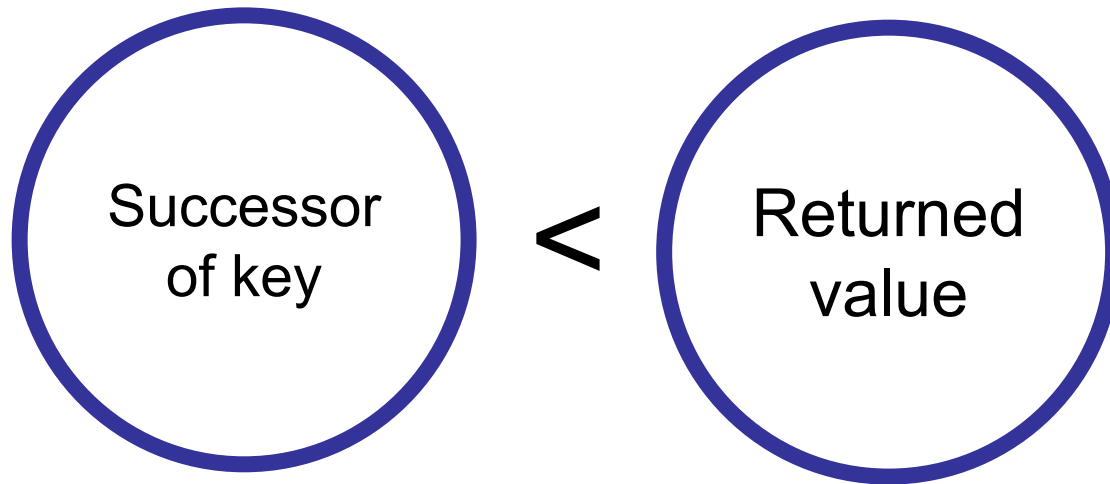
---

Assume not:

# Successor: Key not in the Tree

---

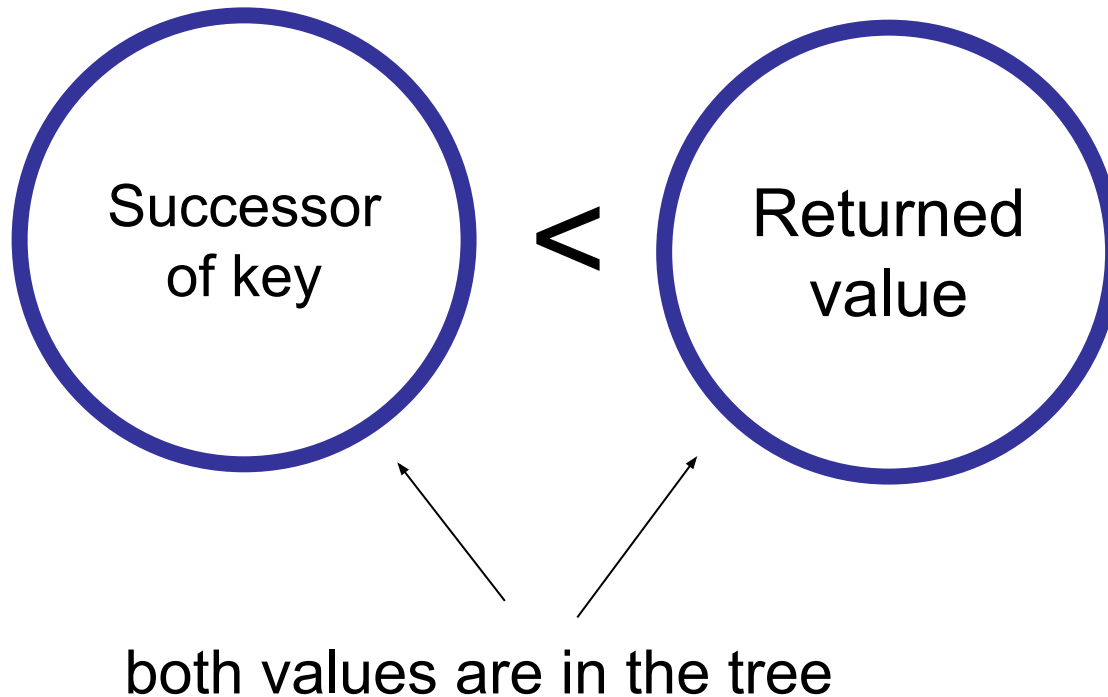
Assume not: Case 1,  $\text{search}(\text{key})$  returns node that is larger than actual successor of key.



# Successor: Key not in the Tree

---

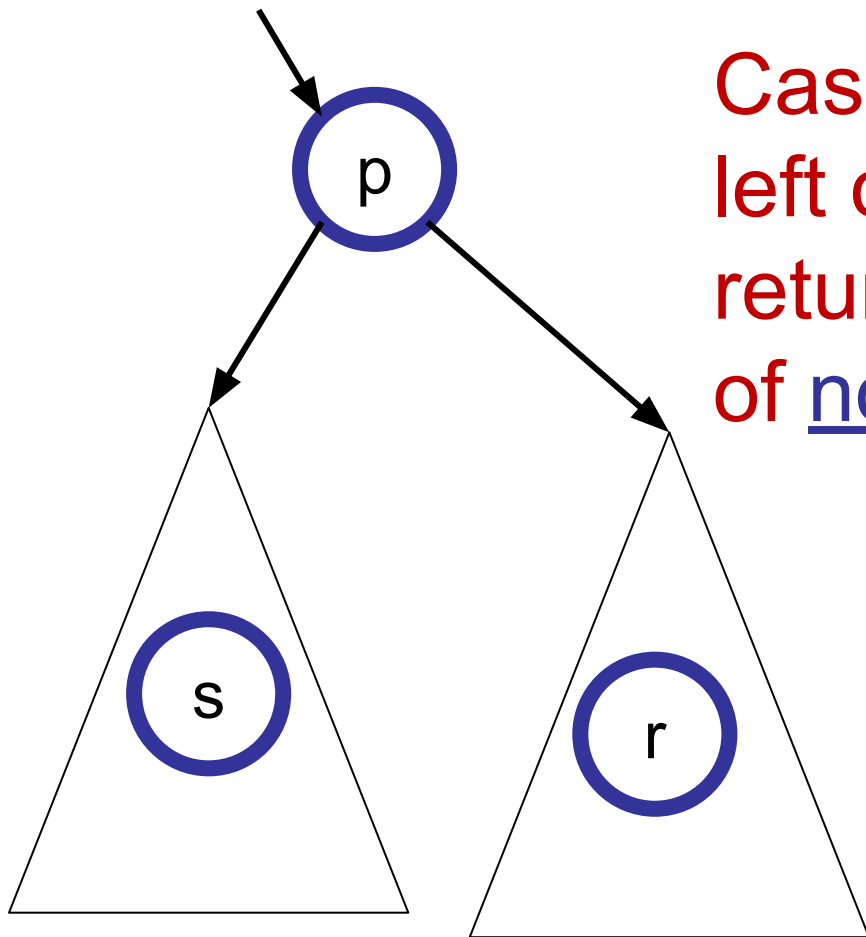
Assume not: Case 1,  $\text{search}(\text{key})$  returns node that is larger than actual successor of key.



# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



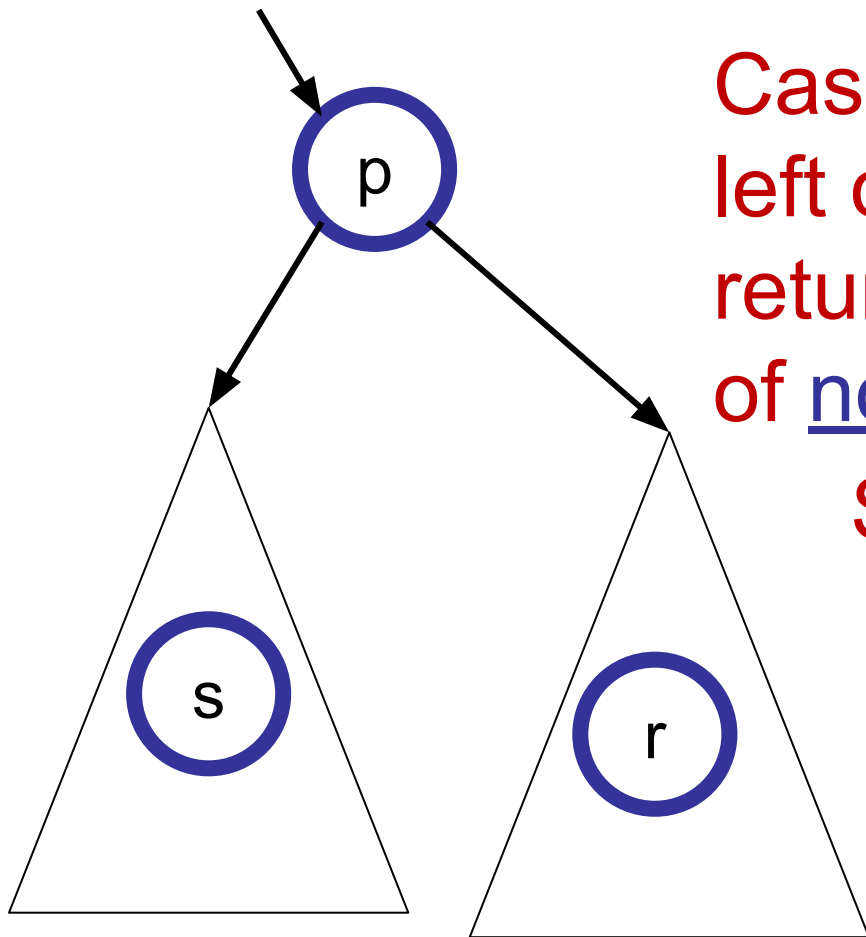
Case 1a: successor node s is left of some node p and returned node r is to the right of node p



# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



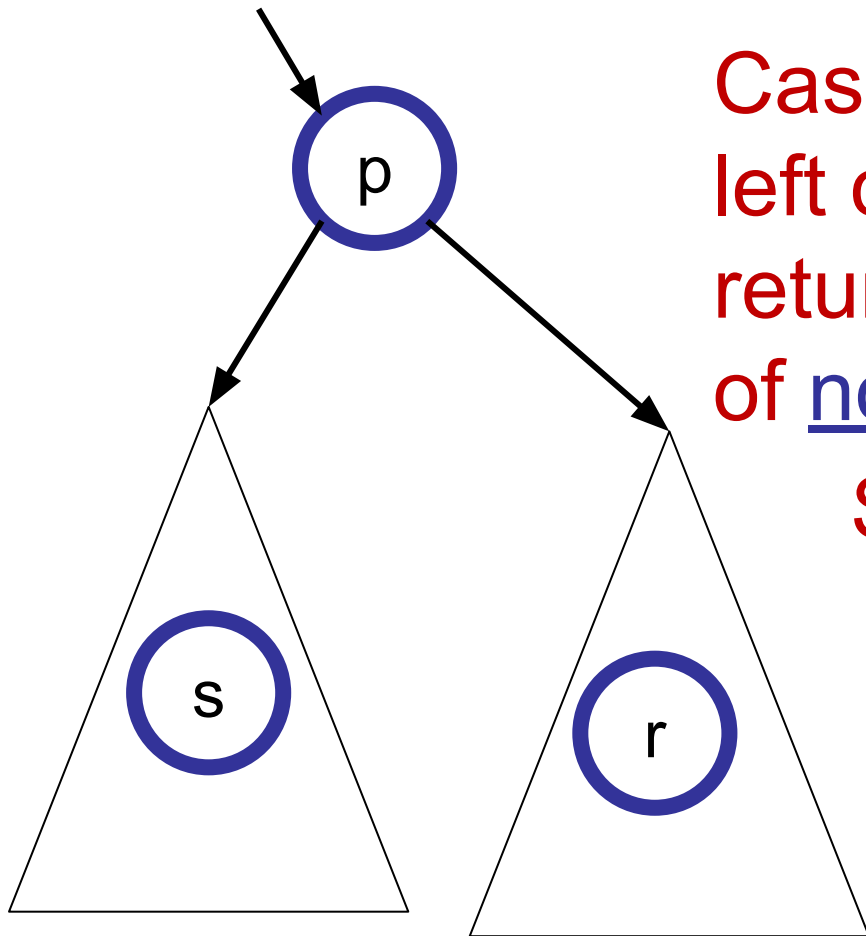
Case 1a: successor node s is left of some node p and returned node r is to the right of node p

Since:  $\text{key} < s < p$

# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



Case 1a: successor node s is left of some node p and returned node r is to the right of node p

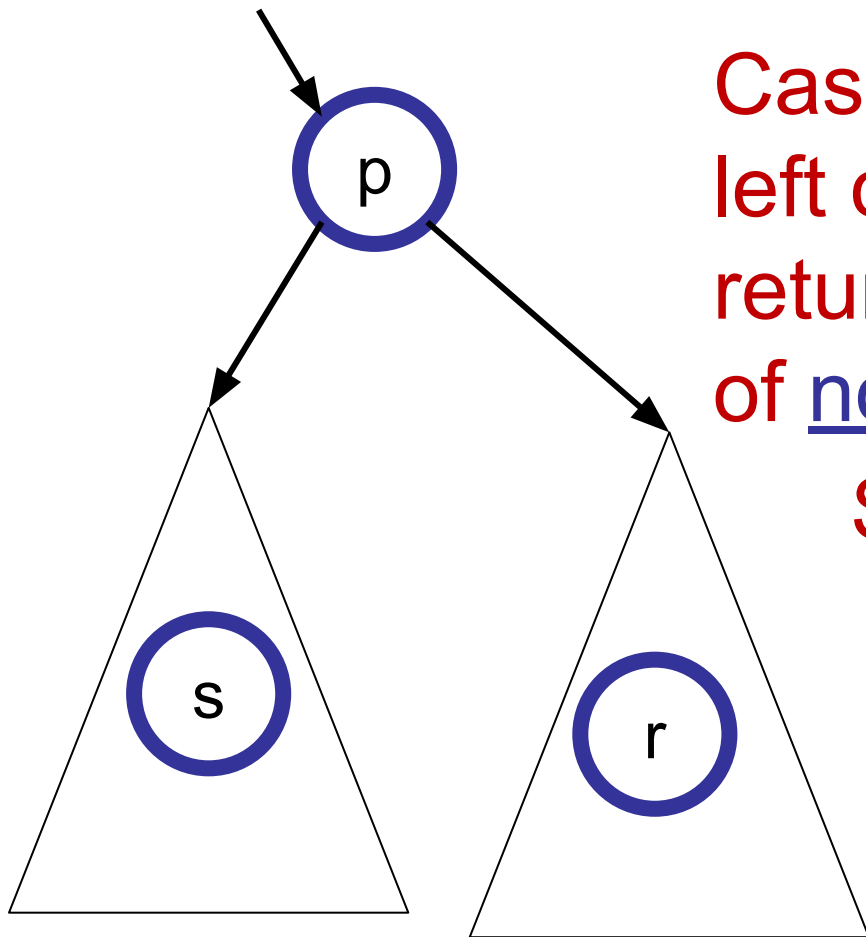
Since:  $\text{key} < s < p$

Our search algorithm should recurse left

# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



Case 1a: successor node s is left of some node p and returned node r is to the right of node p

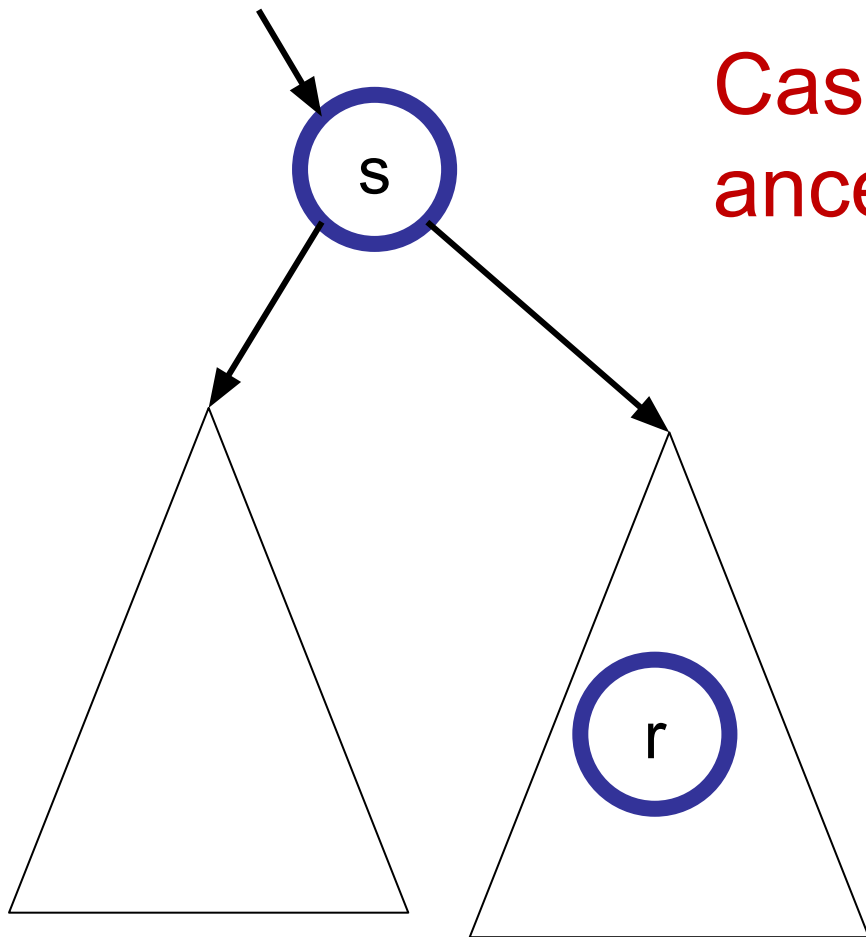
Since:  $\text{key} < s < p$

Our search algorithm cannot return node r

# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



Case 1b: successor node s is ancestor of returned node r

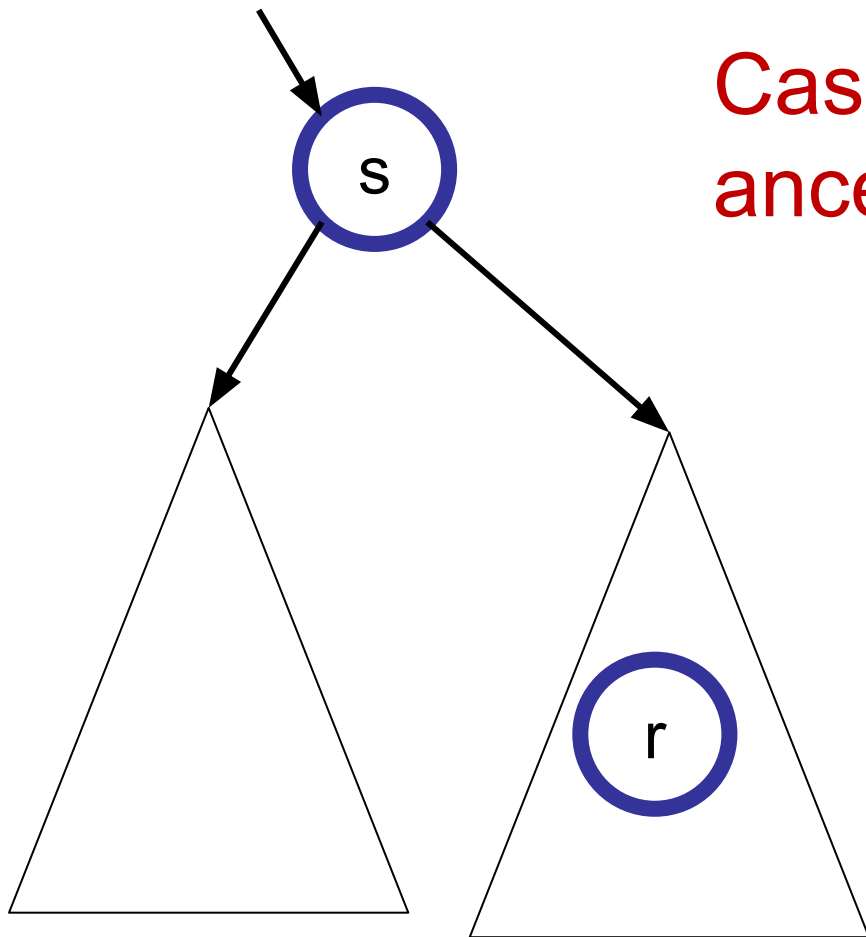
Since:  $\text{key} < s < r$

Our search algorithm should recurse left

# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



Case 1b: successor node s is ancestor of returned node r

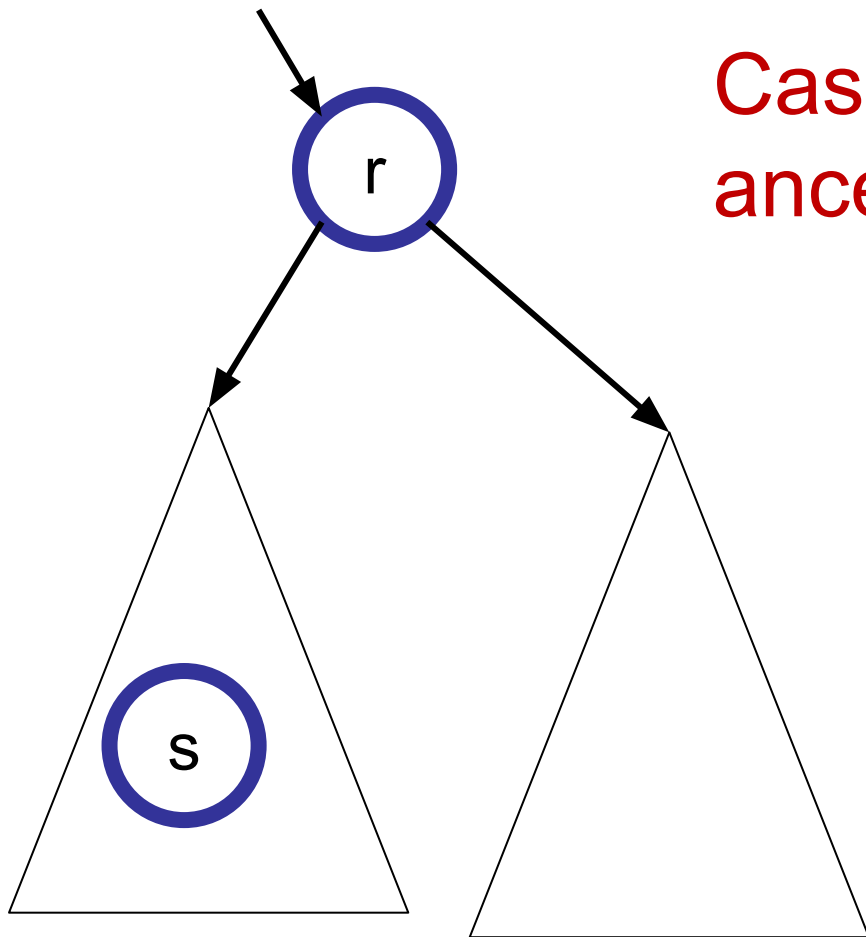
Since:  $\text{key} < s < r$

Our search algorithm cannot return node r

# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



Case 1c: successor node s is ancestor of returned node r

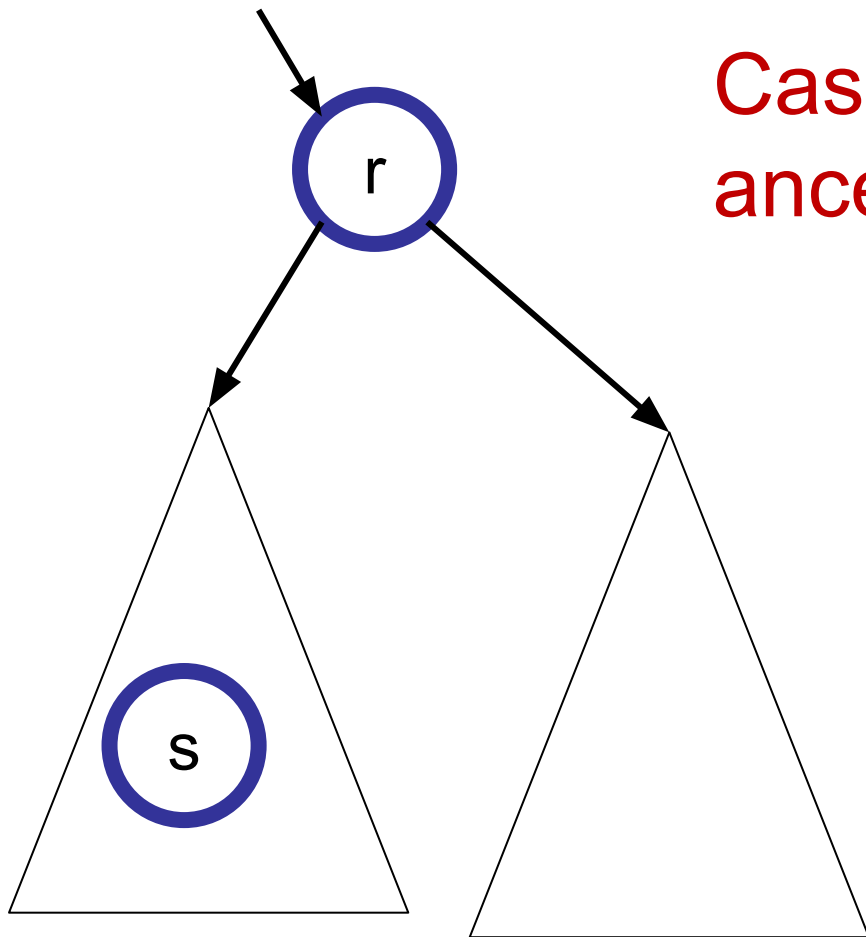
Since:  $\text{key} < s < r$

Our search algorithm should recurse left

# Successor: Key not in the Tree

---

Assume not: Case 1, search(key) returns node that is larger than actual successor of key.



Case 1c: successor node s is ancestor of returned node r

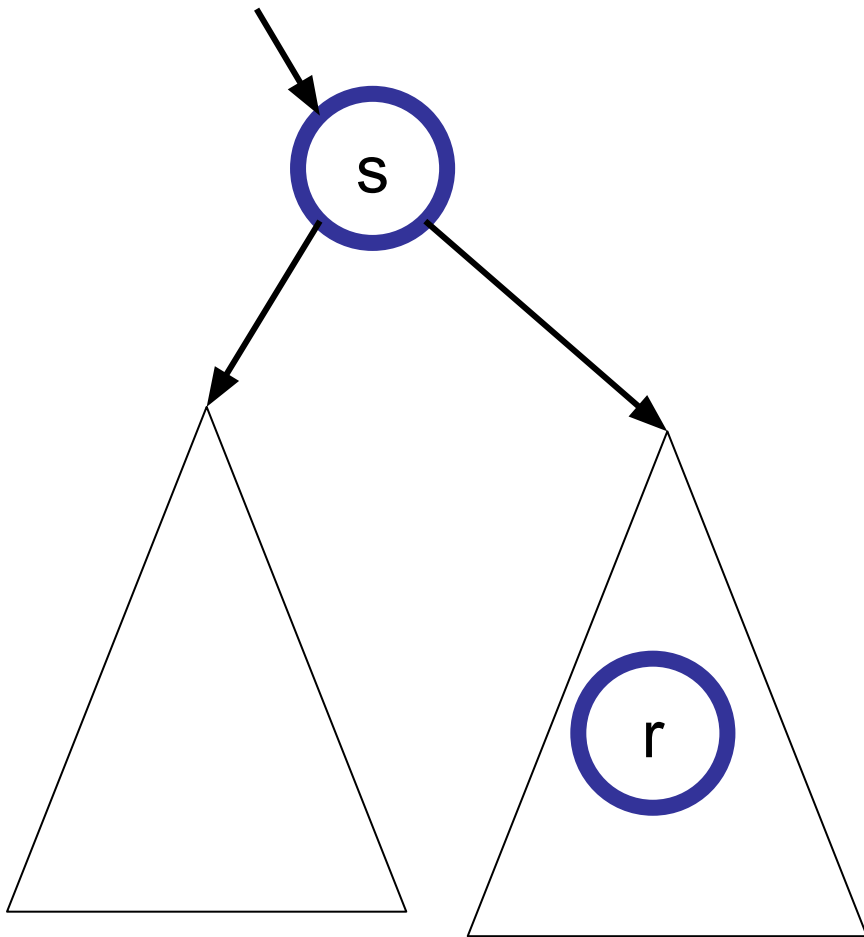
Since:  $\text{key} < s < r$

Our search algorithm cannot return node r

# Successor: Key not in the Tree

---

Assume not: Case 1,  $\text{search}(\text{key})$  returns node that is larger than actual successor of key.



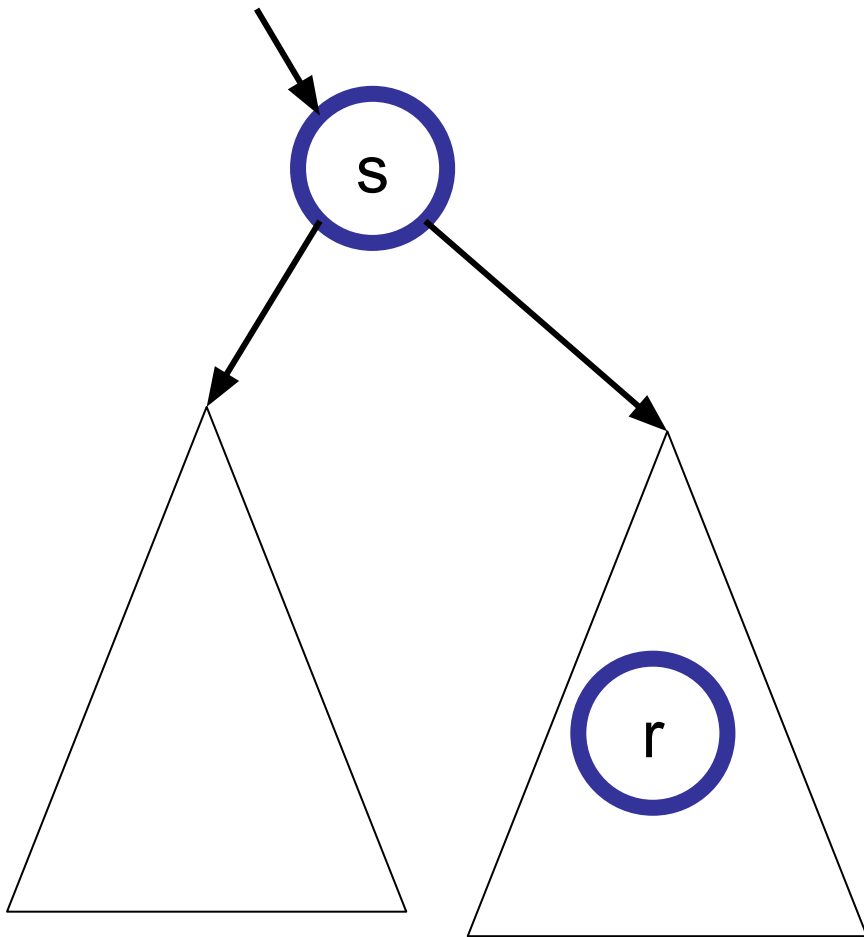
Case 1 derives a contradiction!



# Successor: Key not in the Tree

---

Assume not: Case 1,  $\text{search}(\text{key})$  returns node that is larger than actual successor of key.



You can argue similarly in case 2 where  $\text{search}(\text{key})$  returns node that is smaller than predecessor of key

# Successor: Key not in the Tree

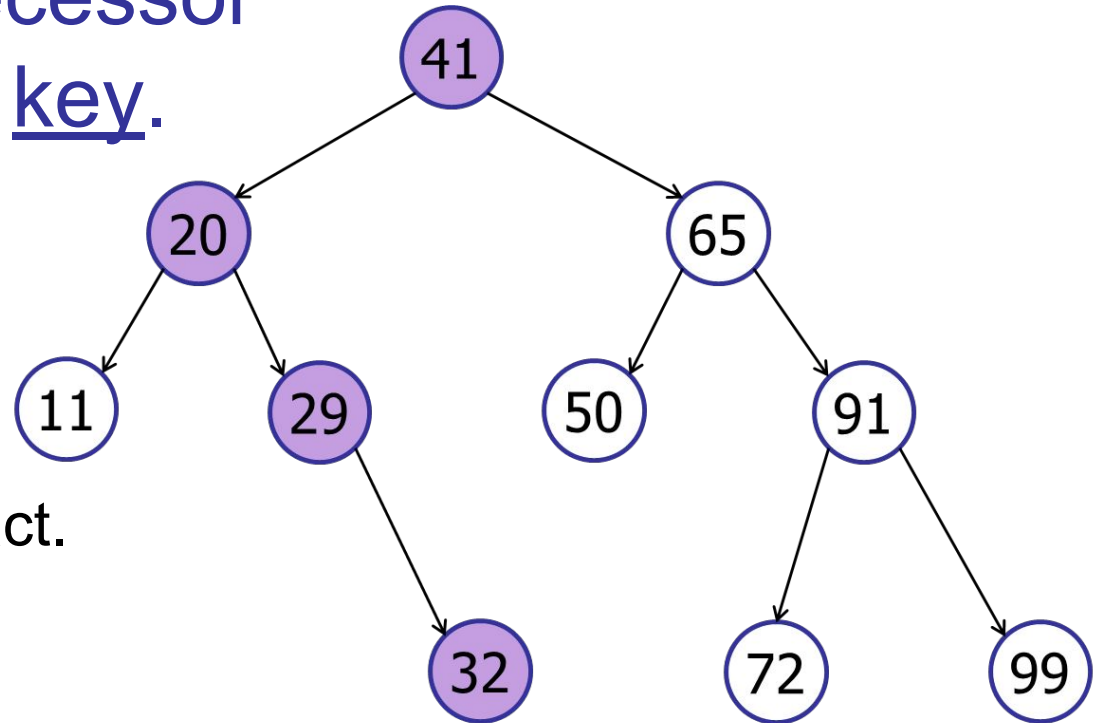
---

But notice: If you search for key not in the tree:

- Either find predecessor or successor of key.



we will make use of this fact.



# Successor Queries

---

Basic strategy: `successor(key)`


1. Search for key in the tree.
2. If  $(\text{result} > \text{key})$ , then return result.
3. If  $(\text{result} \leq \text{key})$ , then search for successor of result.

# Successor Queries

---

Basic strategy: `successor(key)`

**proven it is  
indeed the  
successor**

1. Search for key in the tree.
  2. If  $(\text{result} > \text{key})$ , then return result.
  3. If  $(\text{result} \leq \text{key})$ , then search for successor of result.
- 

# Successor Queries

---

Basic strategy: `successor(key)`

**proven it is  
indeed the  
successor**

1. Search for key in the tree.
2. If `(result > key)`, then return result.
3. If `(result <= key)`, then search for successor of result.

**if result == key,  
successor(key) is the  
true successor**

# Successor Queries

---

Basic strategy: `successor(key)`

proven it is  
indeed the  
successor

1. Search for `key` in the tree.
2. If `(result > key)`, then return `result`.
3. If `(result <= key)`, then search for successor of `result`.

if `result == key`,  
`successor(key)` is the  
true successor

if `result < key`, then  
`successor(result)` is the first  
smallest `result > key`  
(because `key` was not in tree!)

# Successor Queries

---

Basic strategy: `successor(key)`

proven it is  
indeed the  
successor

1. Search for key in the tree.
2. If  $(\text{result} > \text{key})$ , then return result.
3. If  $(\text{result} \leq \text{key})$ , then search for successor of result.

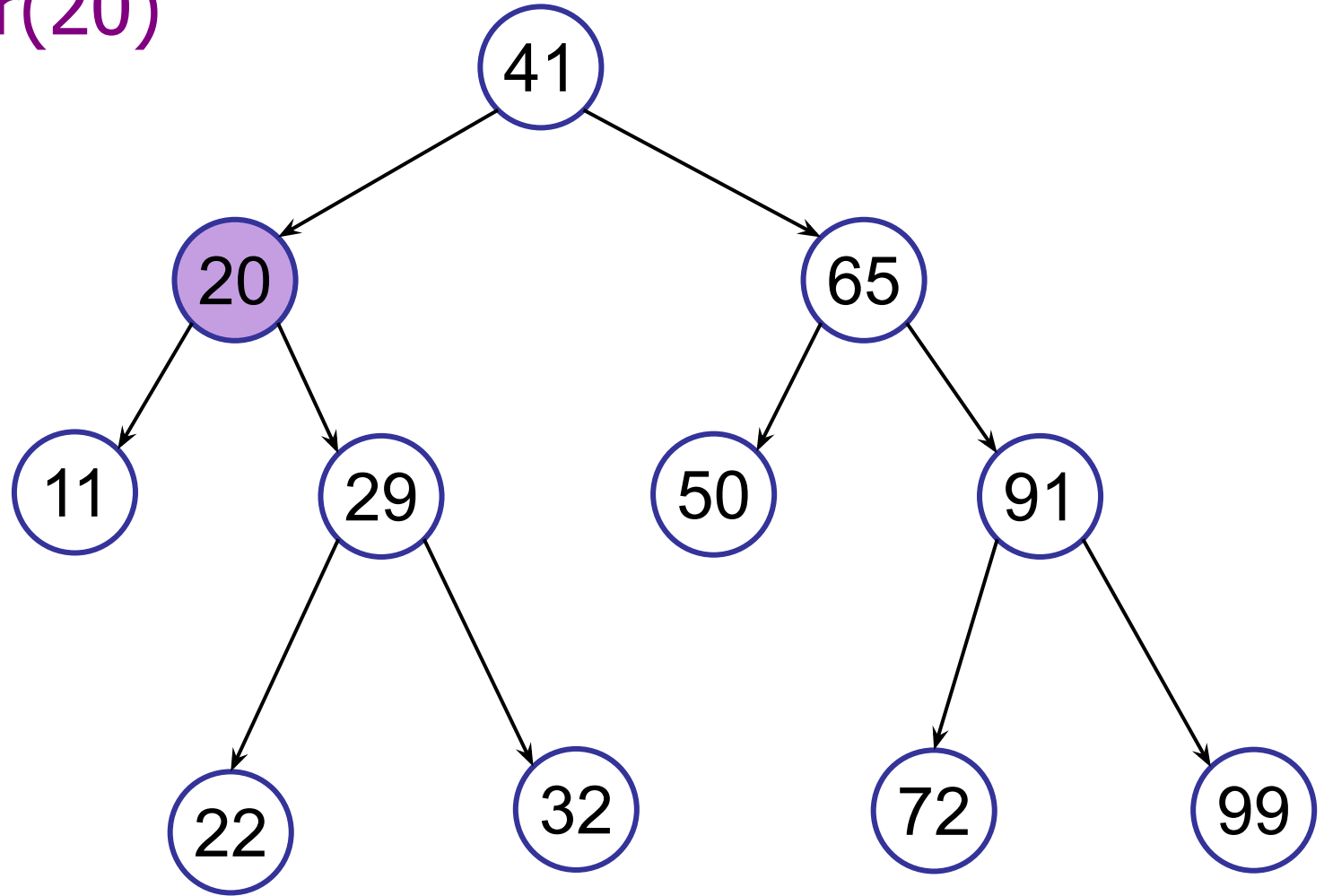
In the bottom case: we are searching for a **successor of an item that is guaranteed to be in a tree.**

Not the same problem as before where item was not in the tree!

# Successor: Key in the Tree

---

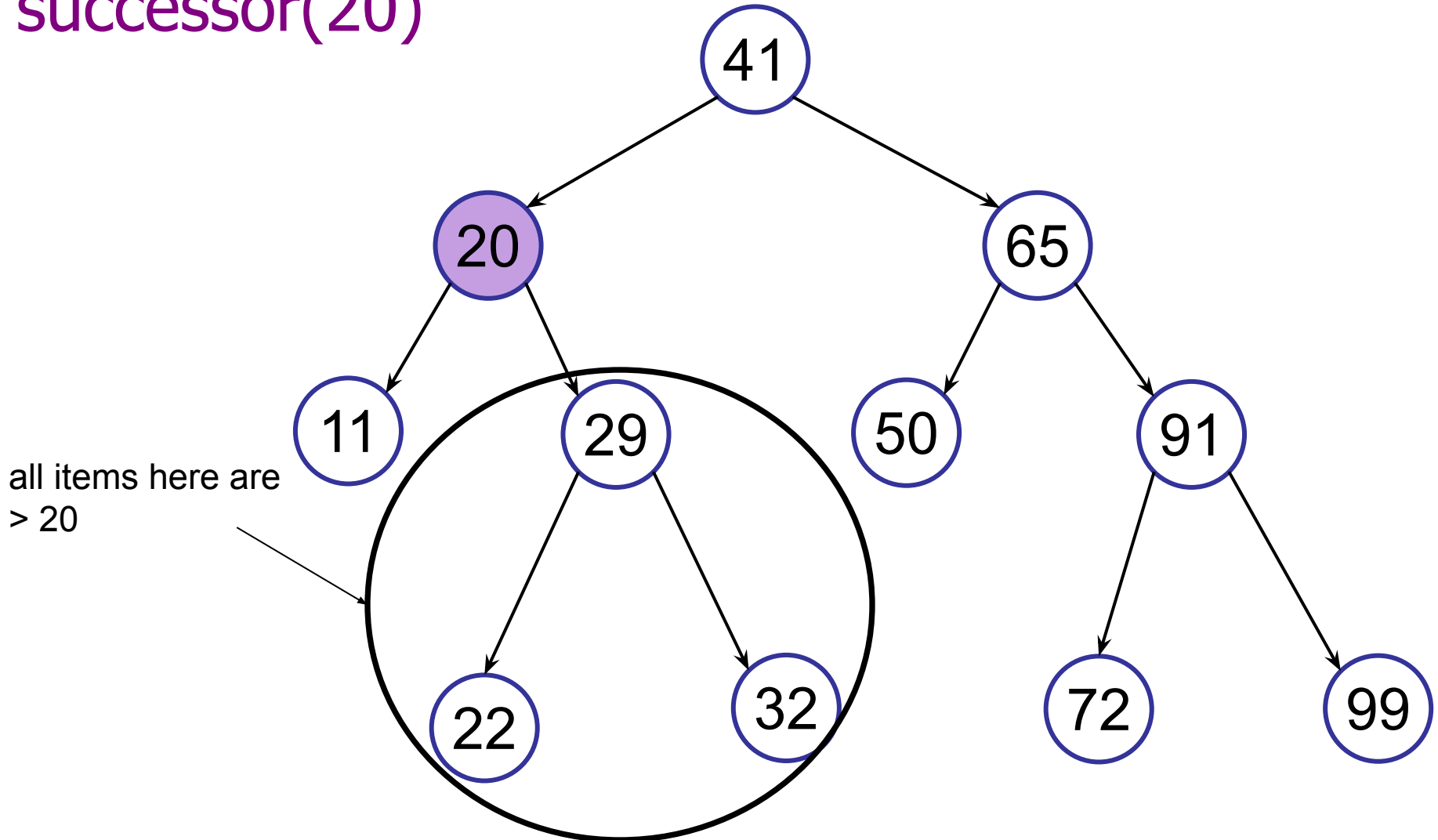
successor(20)





# Successor Queries

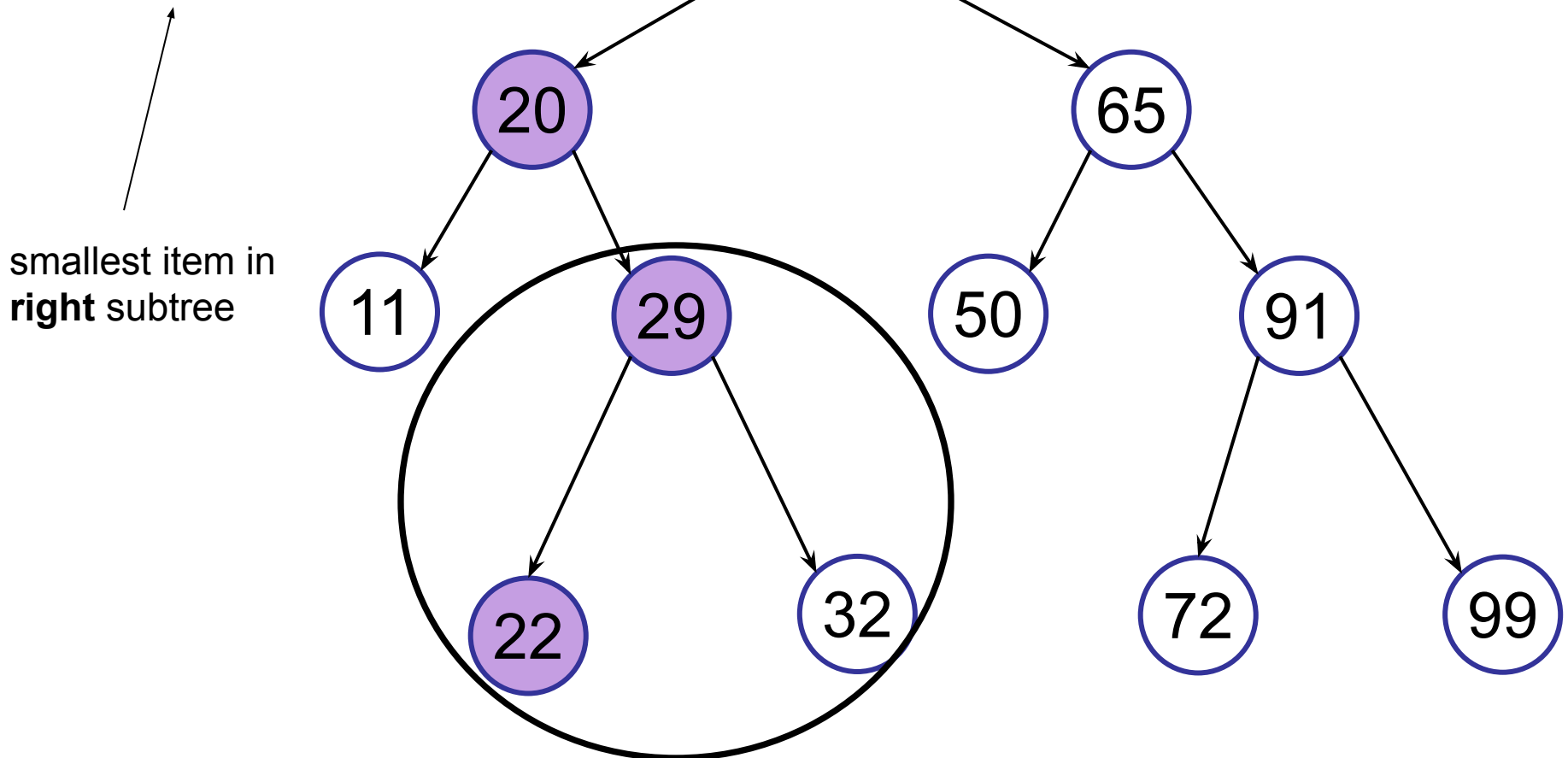
successor(20)



Case 1: node has a right child.

# Successor Queries

successor(20) =  
right.searchMin()

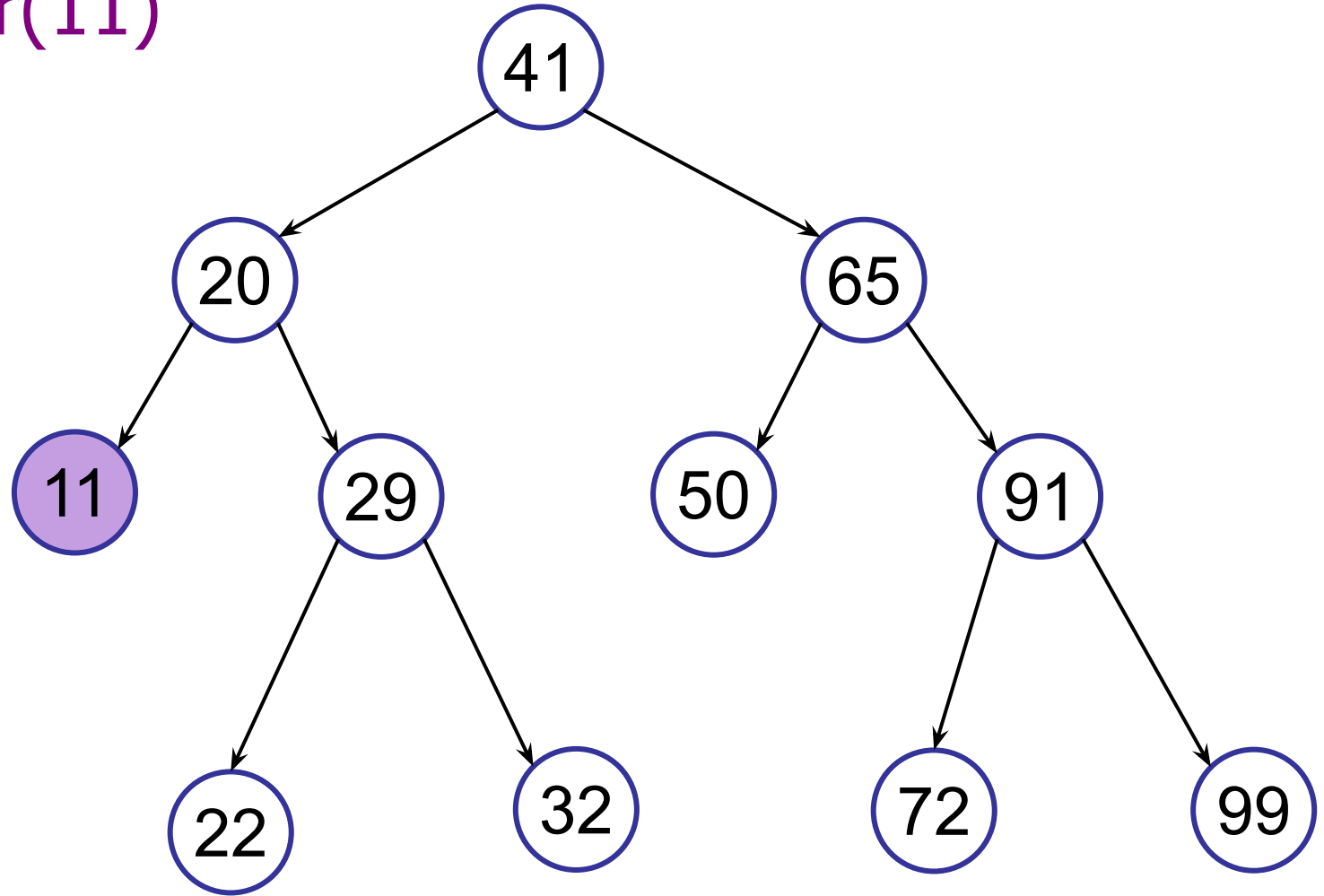


Case 1: node has a right child.

# Successor Queries

---

successor(11)

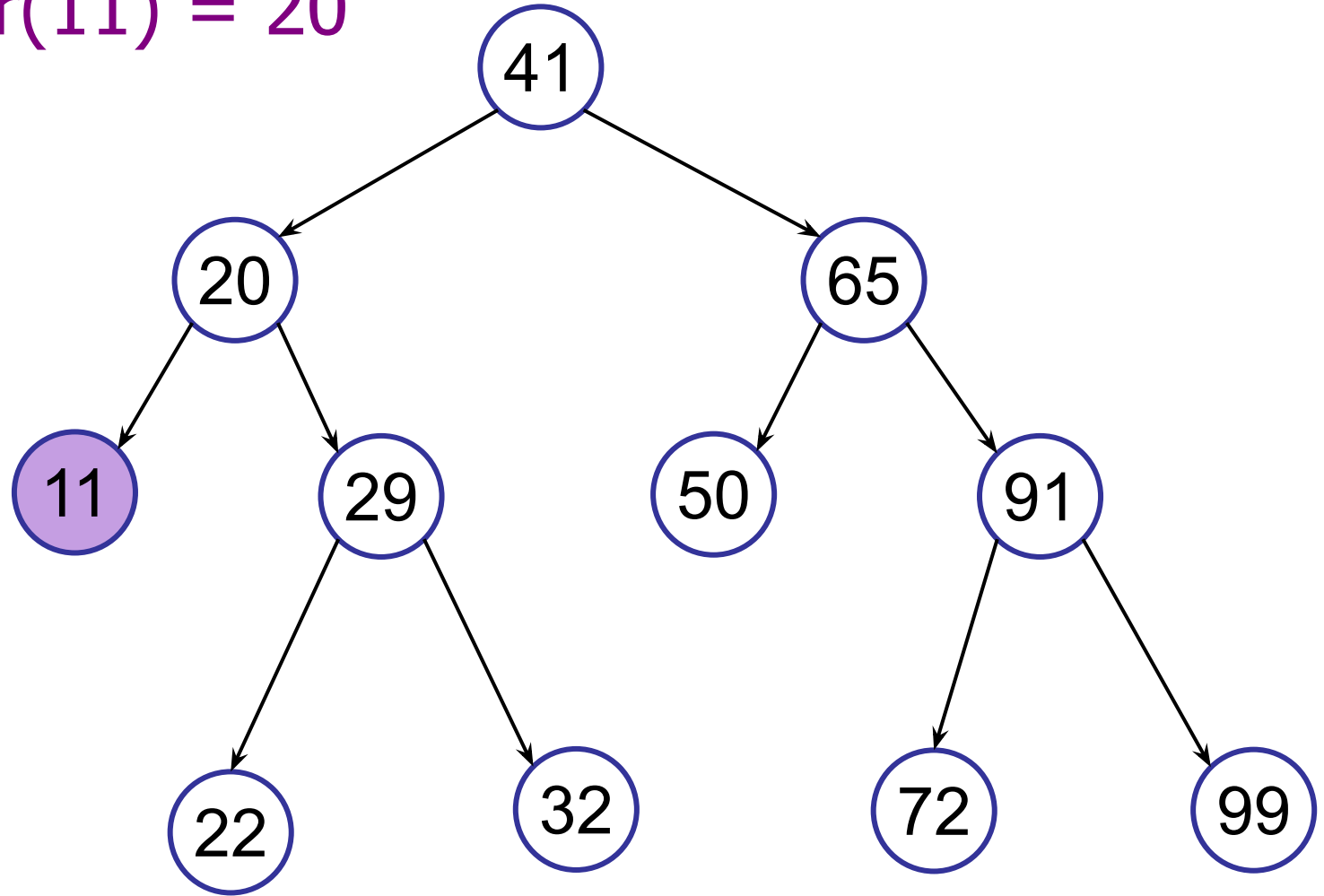


Case 2: node has no right child.

# Successor Queries

---

successor(11) = 20

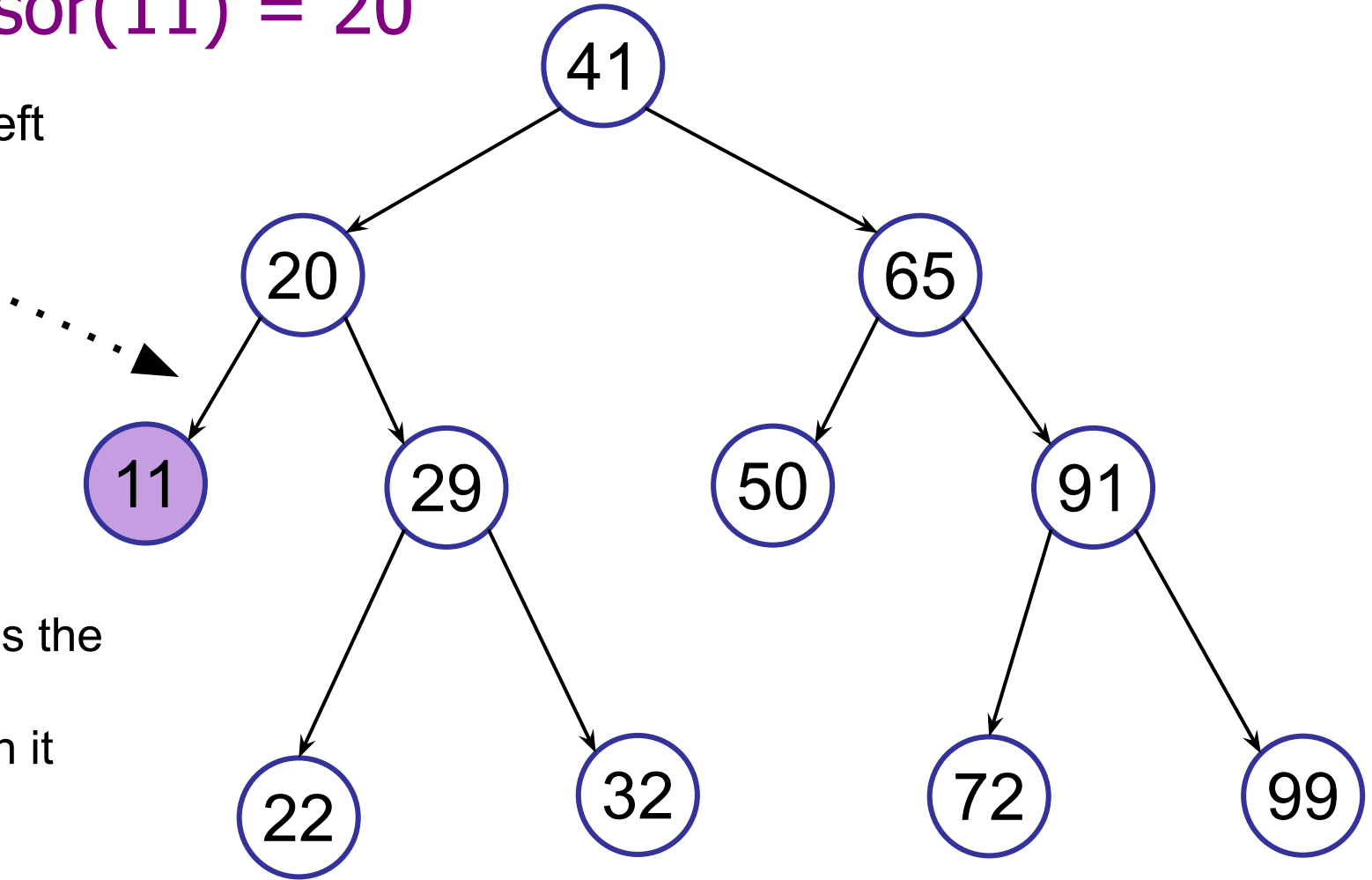


Case 2: node has no right child.

# Successor Queries

$\text{successor}(11) = 20$

11 is the left  
child of its  
parent.



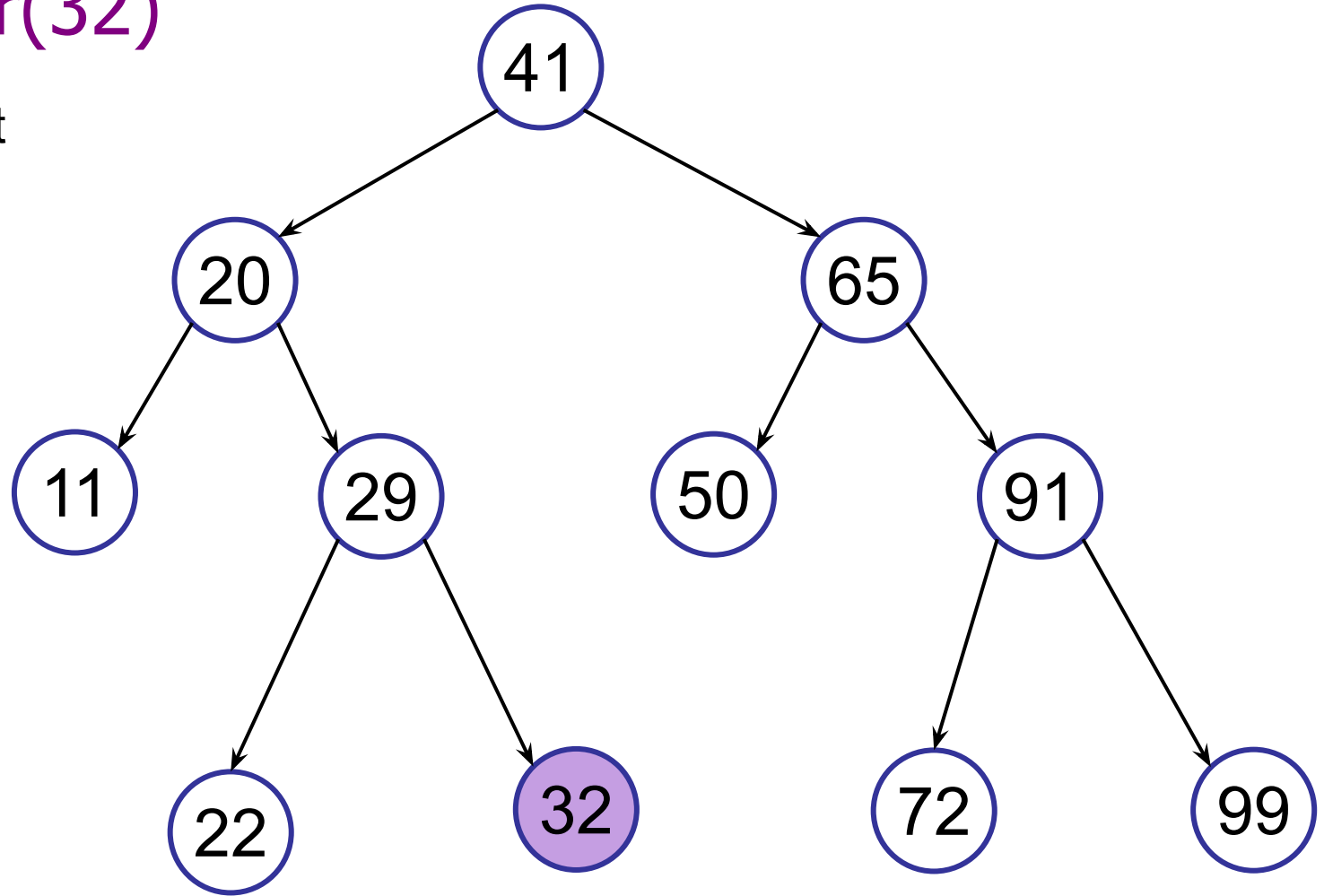
Case 2: node has no right child.

# Successor Queries

---

successor(32)

32 is the right  
child of its  
parent

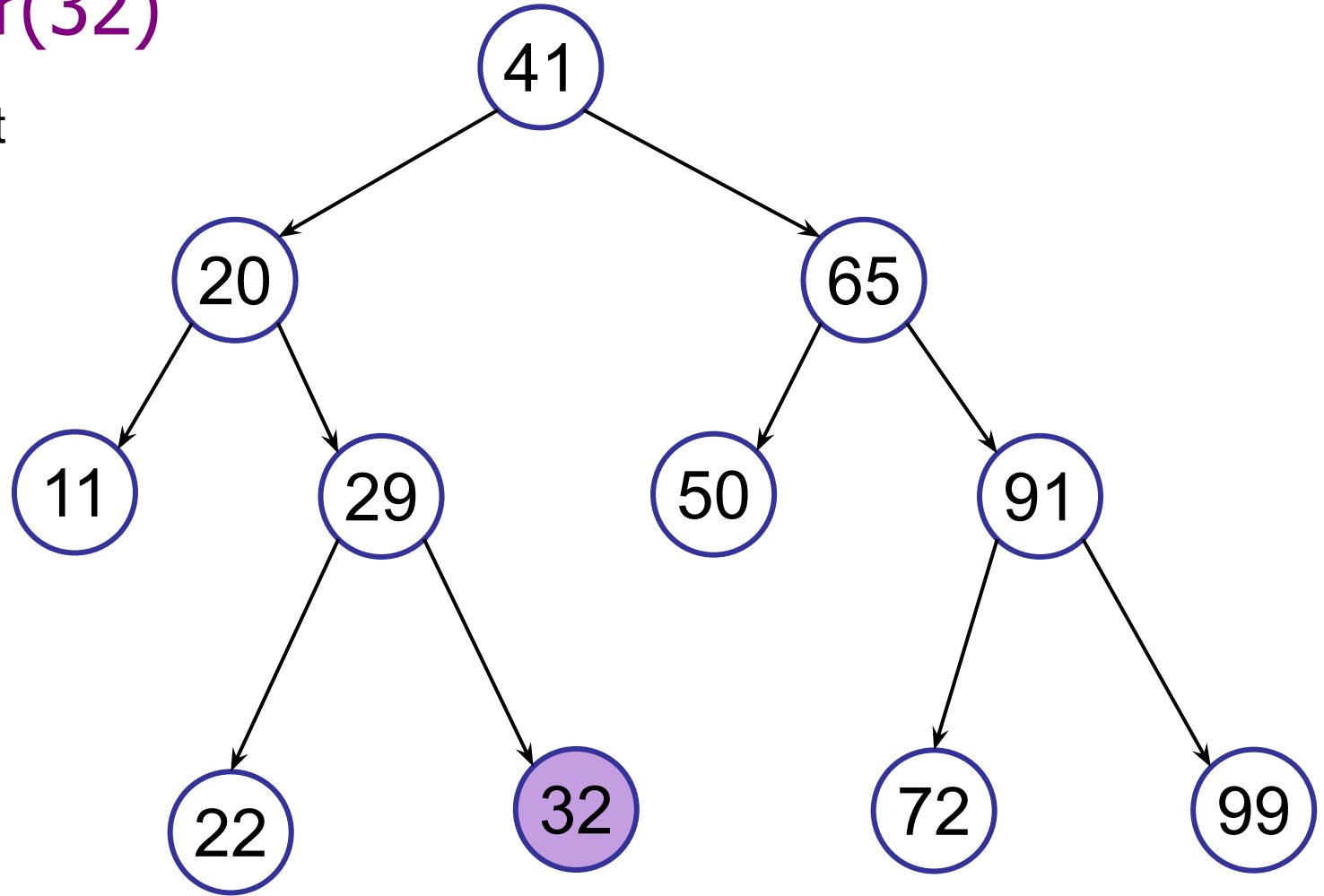


Case 2: node has no right child.

# Successor Queries

successor(32)

32 is the right  
child of its  
parent



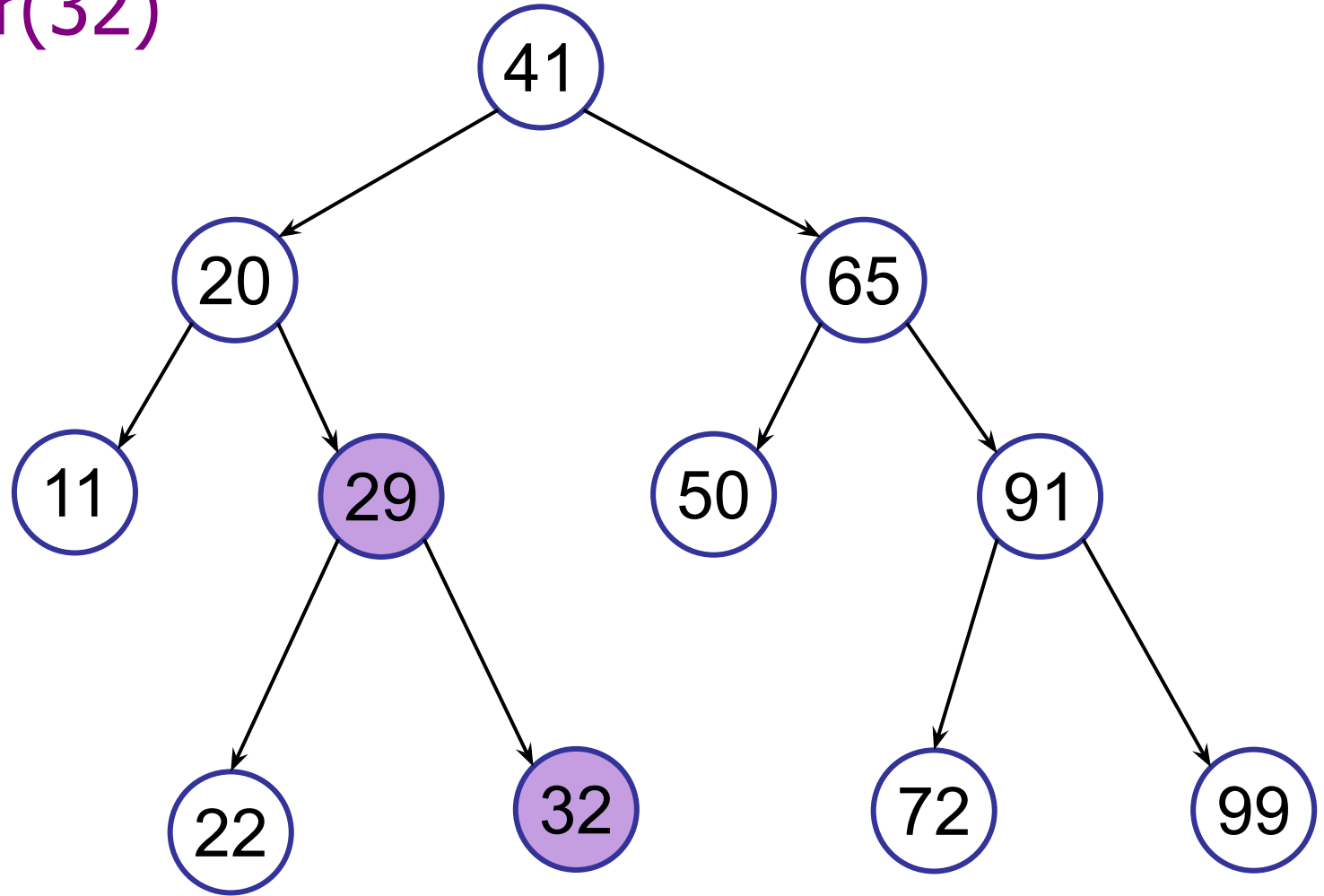
How now  
brown cow?

Case 2: node has no right child.

# Successor Queries

---

successor(32)



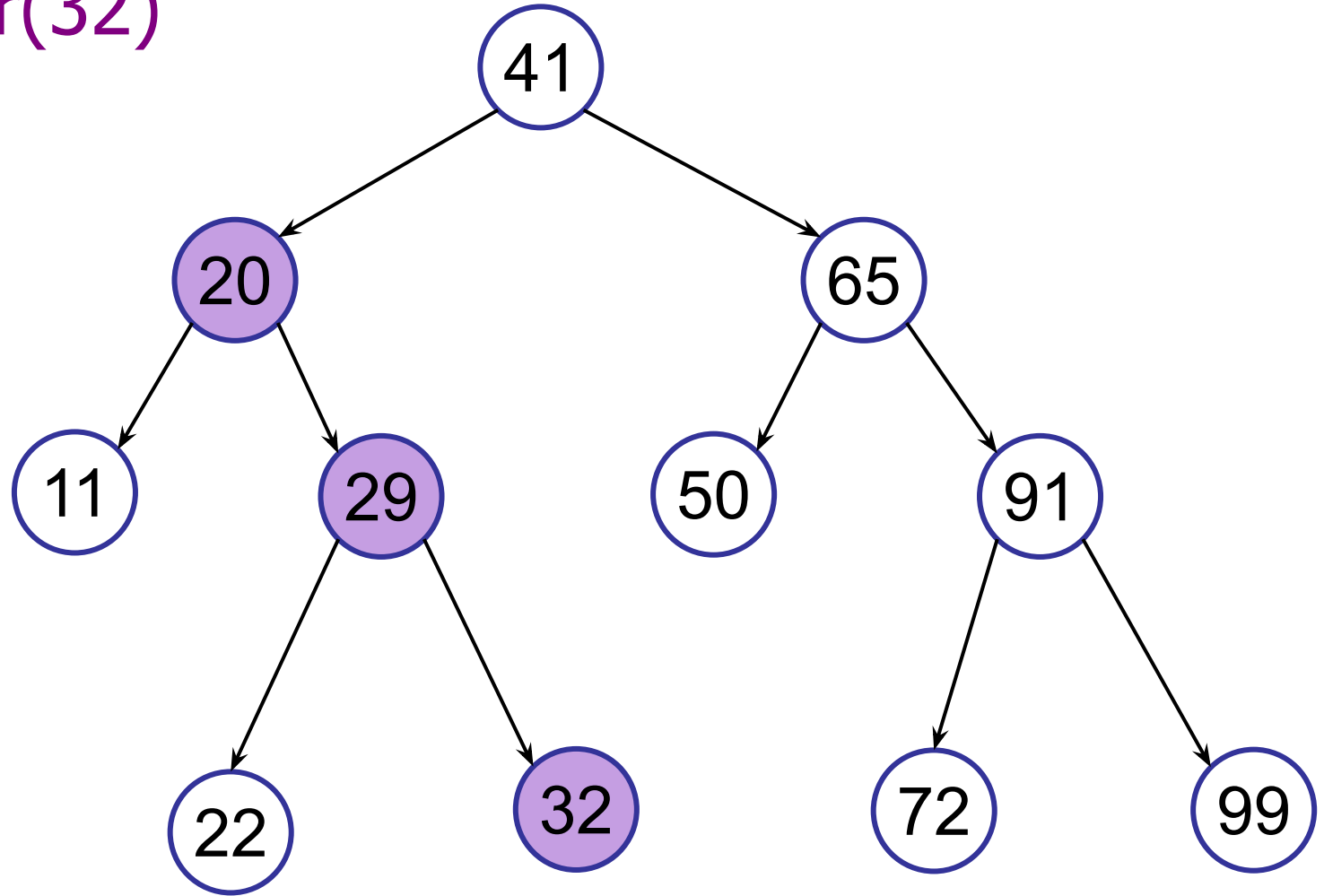
Case 2: node has no right child.



# Successor Queries

---

successor(32)

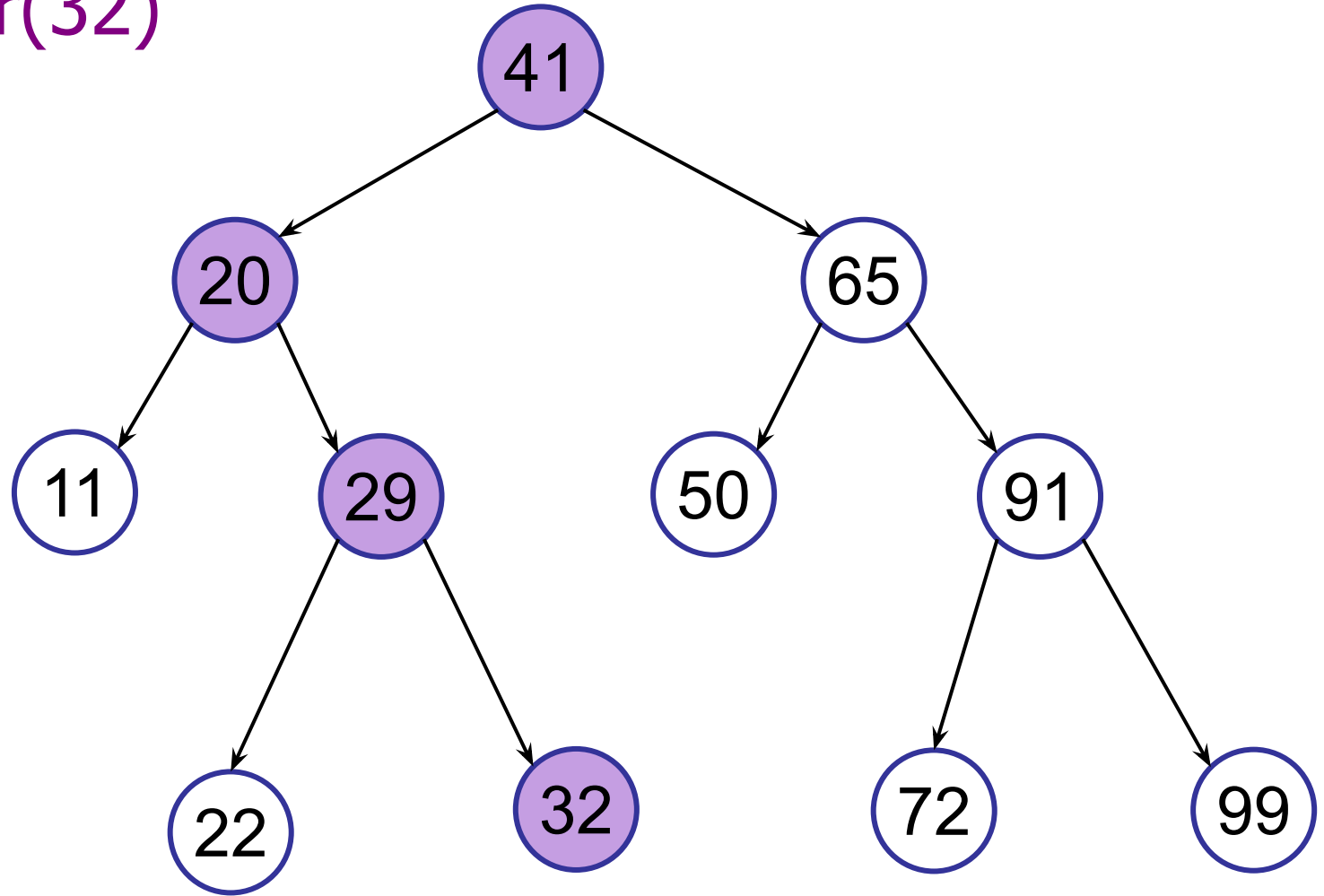


Case 2: node has no right child.

# Successor Queries

---

successor(32)



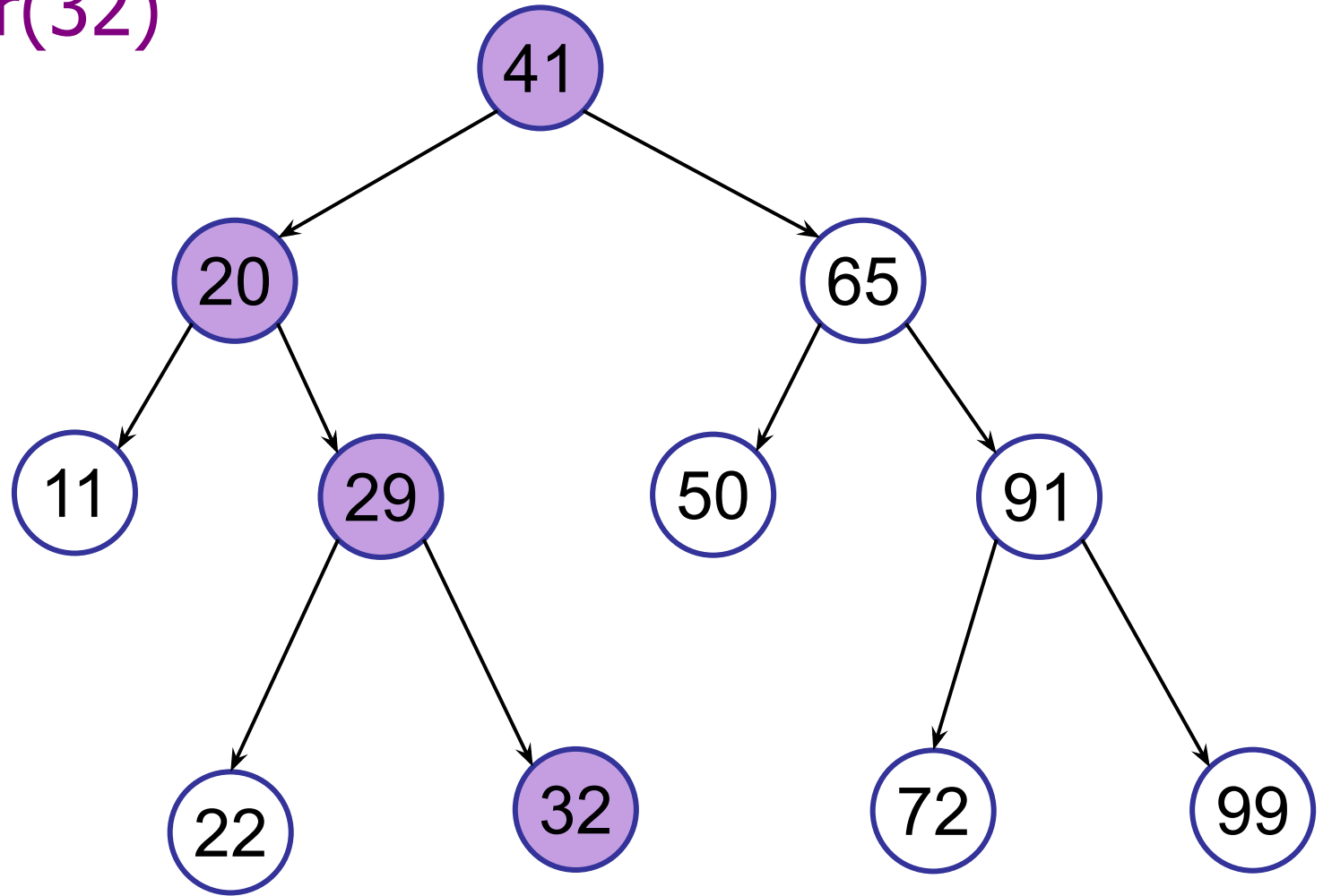
Case 2: node has no right child.

# Successor Queries

---

successor(32)

successor of  
41 is  
successor of  
32

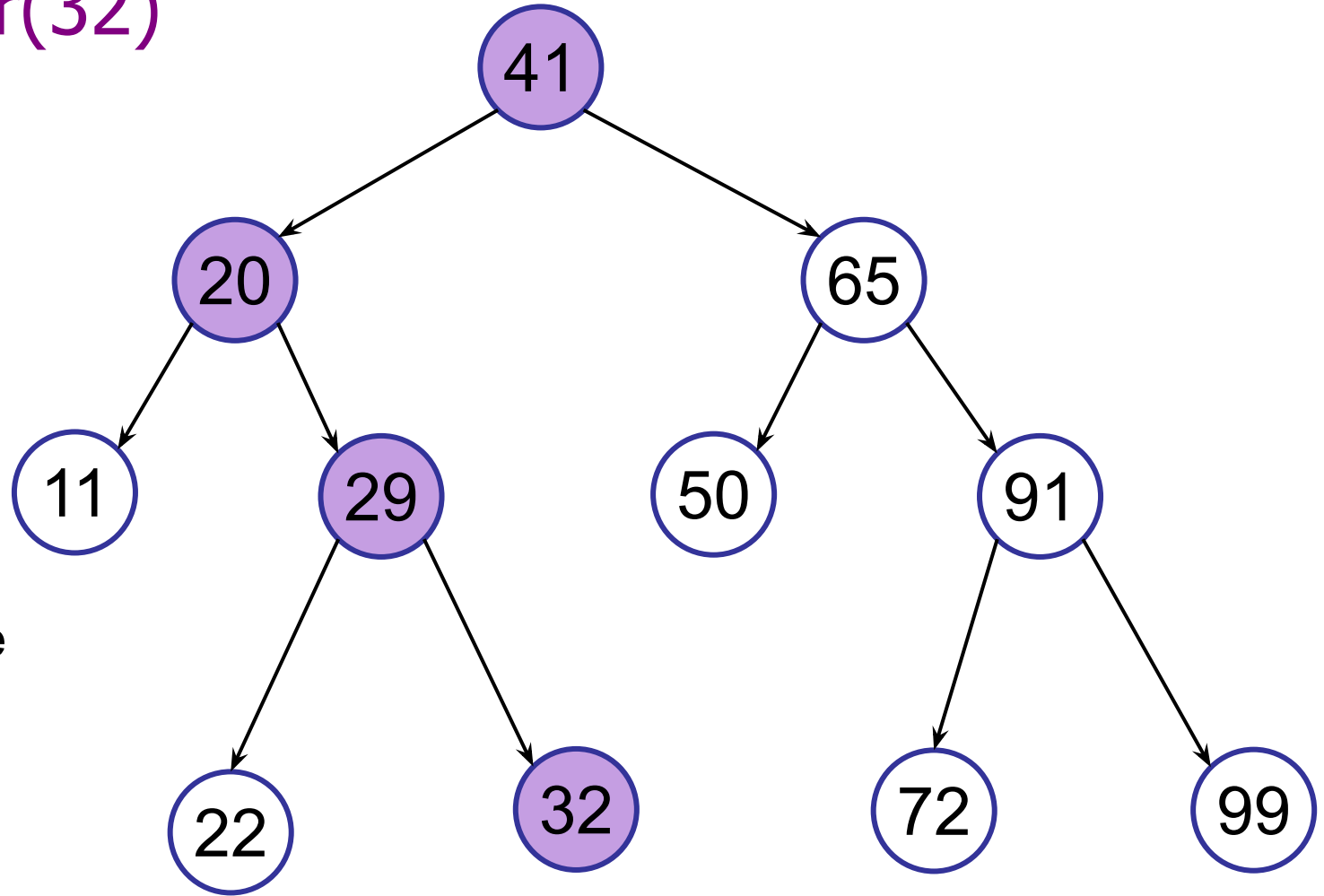


Case 2: node has no right child.

# Successor Queries

successor(32)

successor of  
41 is  
successor of  
32



this was done  
recursively!

Case 2: node has no right child.

# Successor Queries

---

## Find the next TreeNode:

```
public TreeNode successor() {  
    if (rightTree != null)  
        return rightTree.searchMin();  
  
    TreeNode parent = parentTree;  
    TreeNode child = this;  
    while ((parent != null) && (child == parent.rightTree))  
        child = parent;  
    parent = child.parentTree;  
}  
return parent;  
}
```

# Successor Queries

---

Find the next TreeNode:

```
public TreeNode successor() {
```

```
    if (rightTree != null)
        return rightTree.searchMin();
```

```
    TreeNode parent = parentTree;
```

```
    TreeNode child = this;
```

```
    while ((parent != null) && (child == parent.rightTree))
```

```
        child = parent;
```

```
        parent = child.parentTree;
```

```
    }
```

```
    return parent;
```

```
}
```

# Successor Queries

---

Find the next TreeNode:

```
public TreeNode successor() {  
    if (rightTree != null)  
        return rightTree.searchMin();
```

```
    TreeNode parent = parentTree;  
    TreeNode child = this;  
    while ((parent != null) && (child == parent.rightTree))  
        child = parent;  
        parent = child.parentTree;  
    }  
    return parent;
```

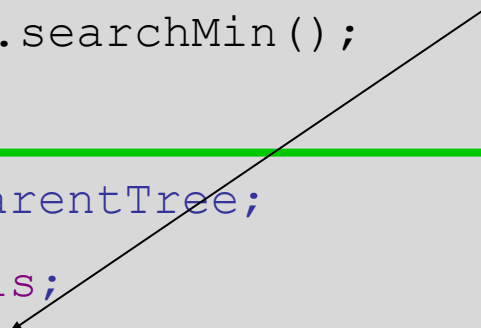
```
}
```

# Successor Queries

## Find the next TreeNode:

```
public TreeNode successor() {  
    if (rightTree != null)  
        return rightTree.searchMin();  
  
    TreeNode parent = parentTree;  
    TreeNode child = this;  
    while ((parent != null) && (child == parent.rightTree))  
        child = parent;  
    parent = child.parentTree;  
}  
return parent;  
}
```

root.parent == null





# Binary Search Trees

---

## 1. Terminology and Definitions

## 2. Basic operations:

- height
- searchMin, searchMax
- search, insert

## 3. Traversals

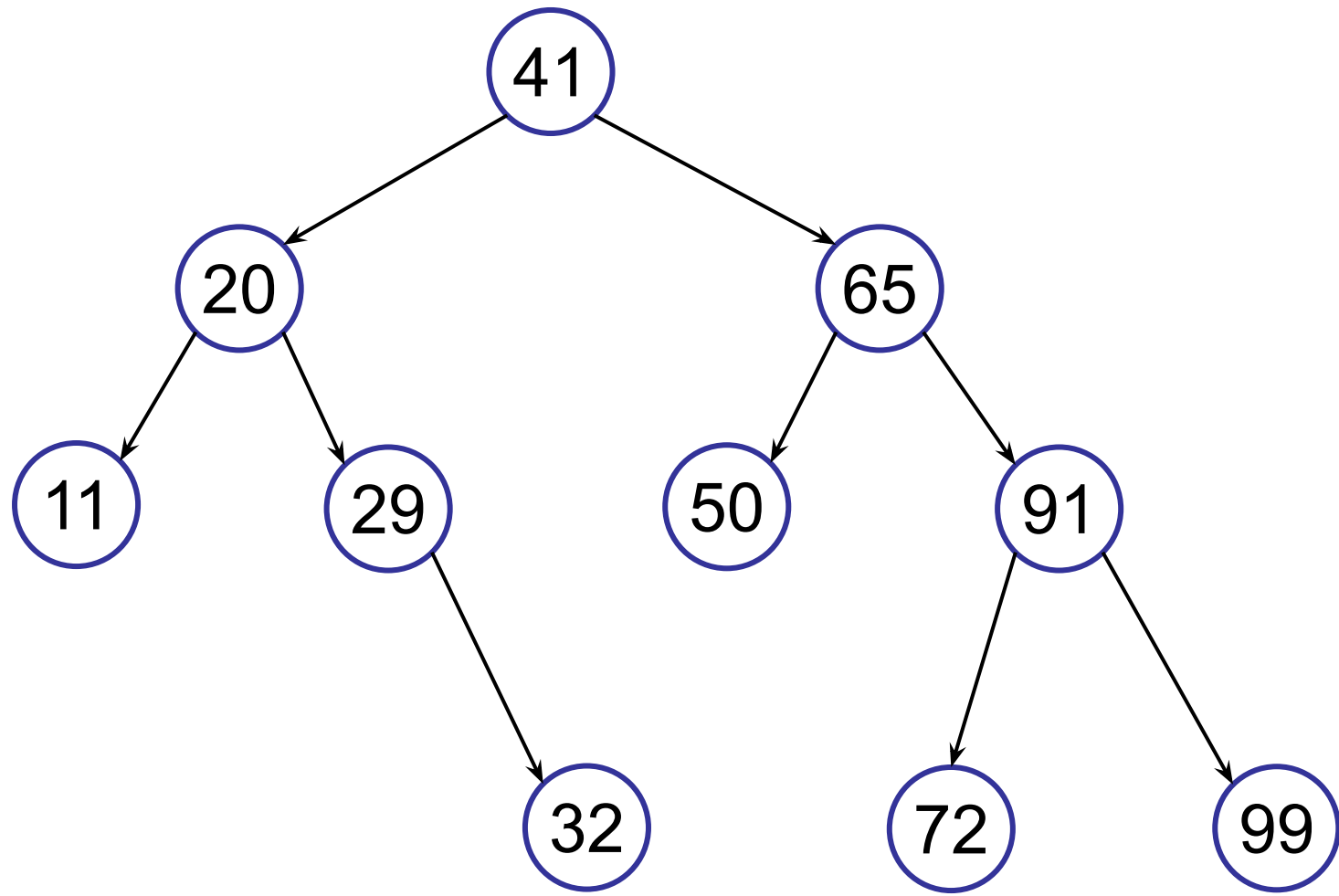
- in-order, pre-order, post-order

## 4. Other operations

# Binary Search Tree

---

delete(v)



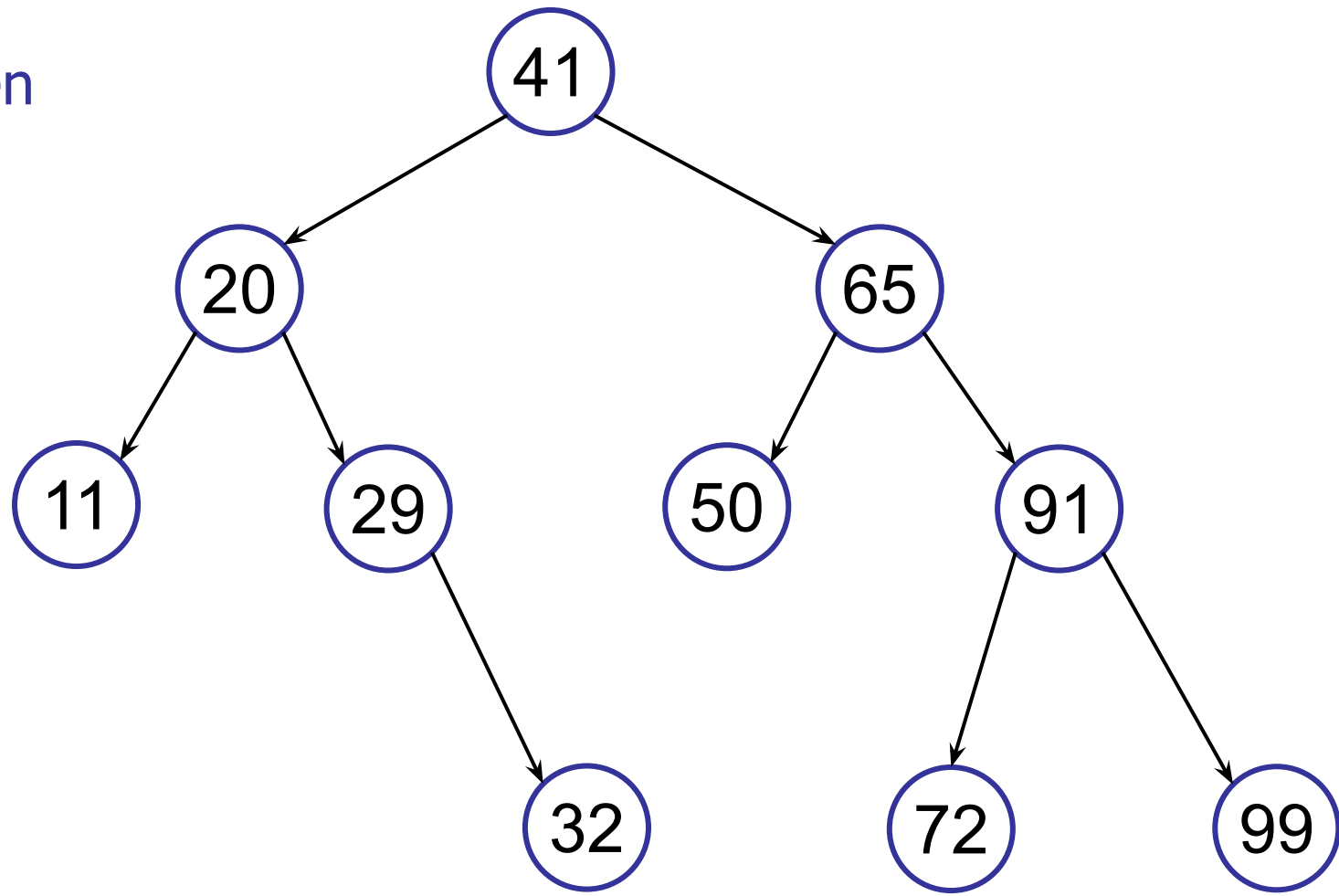
# Binary Search Tree

---

delete(v)

Three cases:

1. No children
2. 1 child
3. 2 children

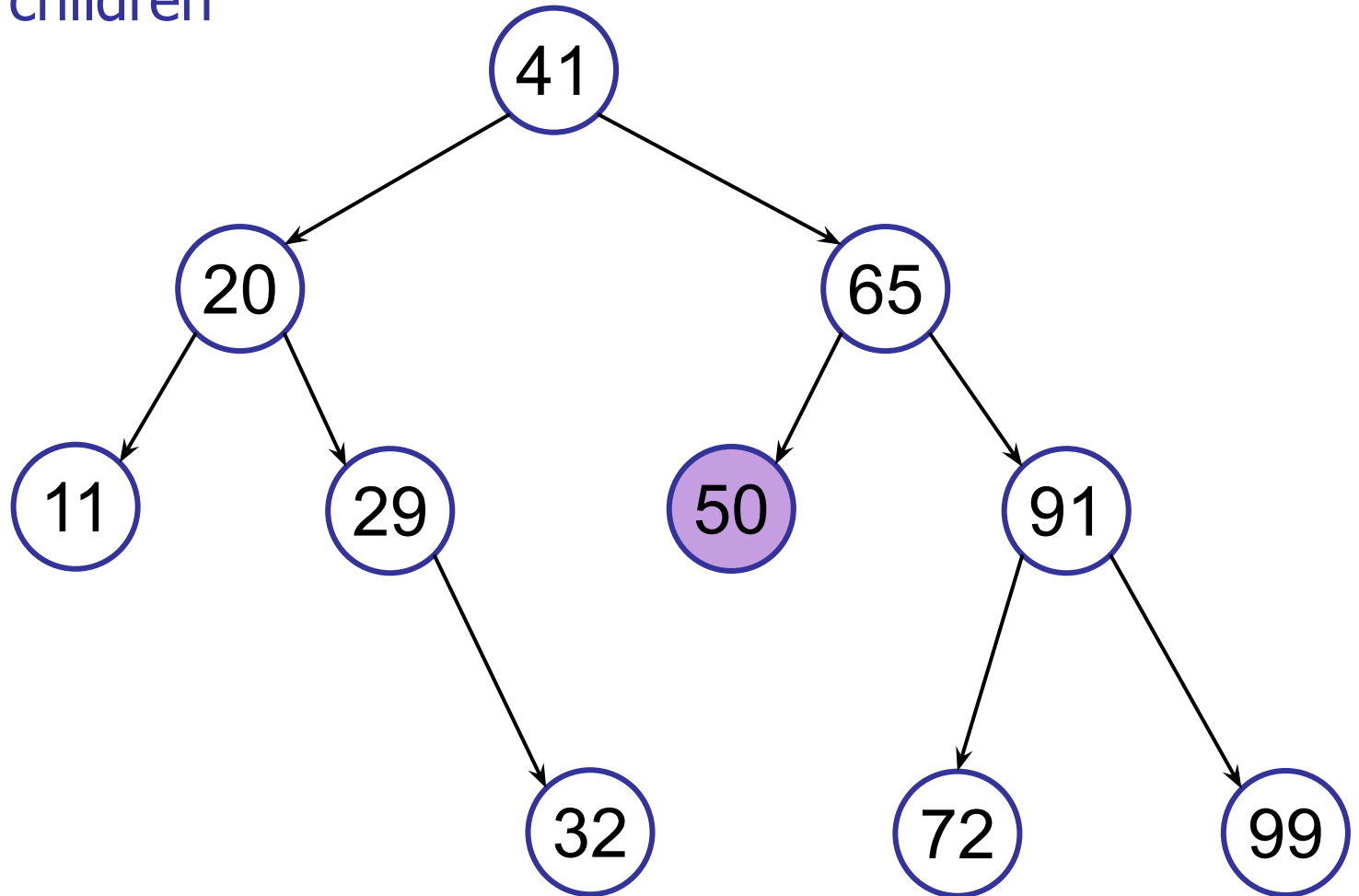


# Binary Search Tree

---

delete(50)

Case 1: No children

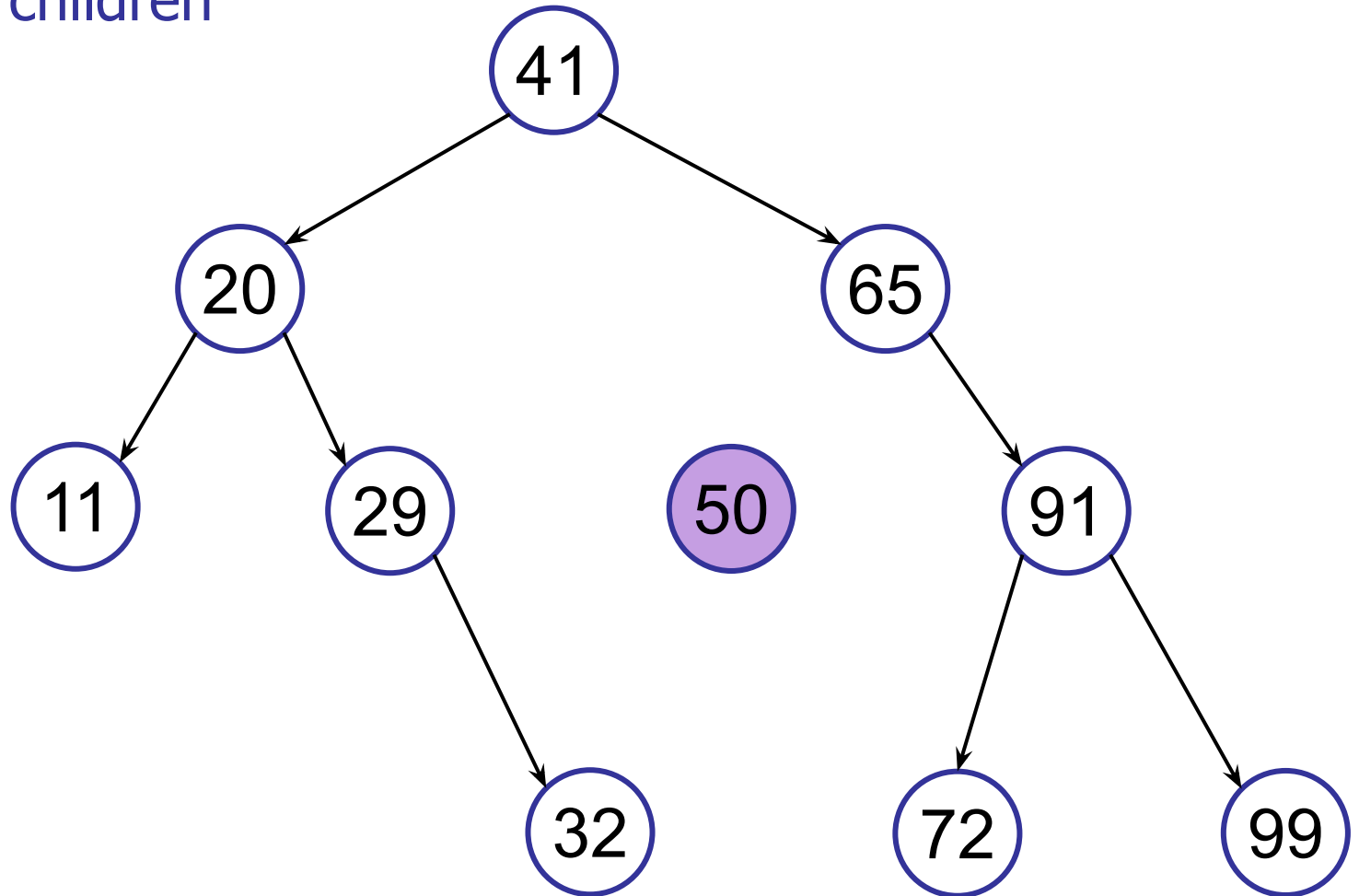


# Binary Search Tree

---

delete(50)

Case 1: No children

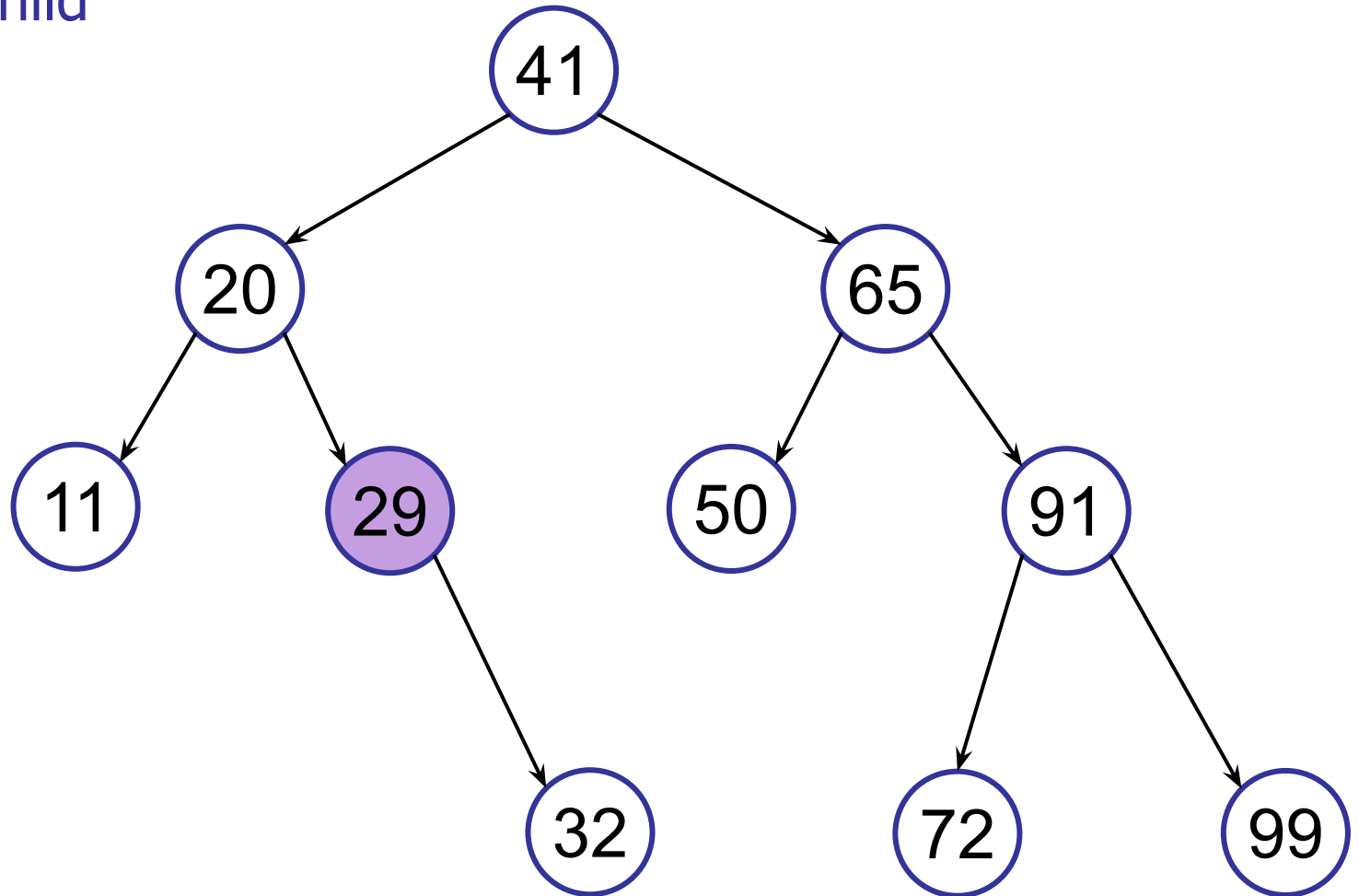


# Binary Search Tree

---

delete(29)

Case 2: 1 child

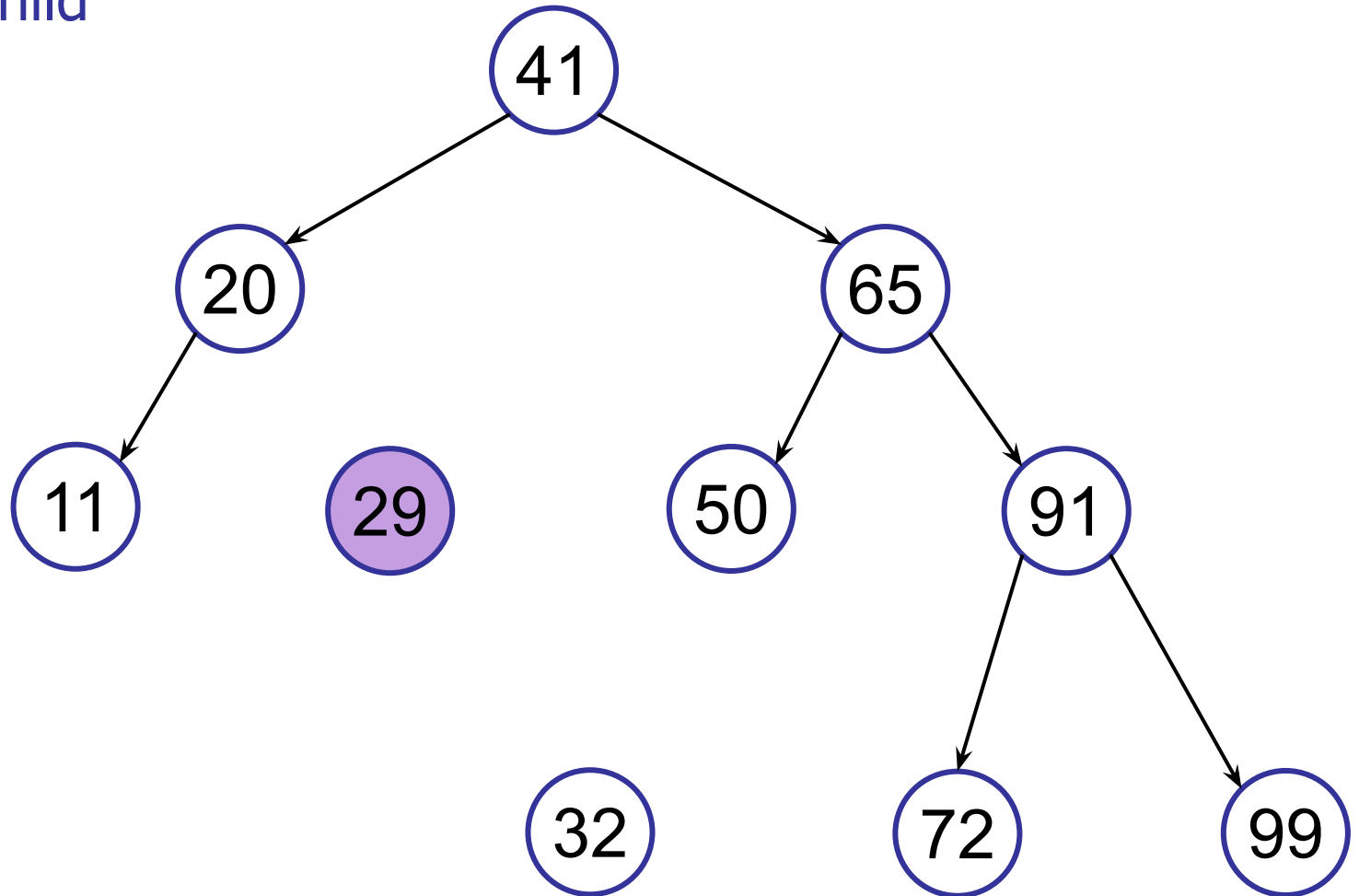


# Binary Search Tree

---

delete(29)

Case 2: 1 child

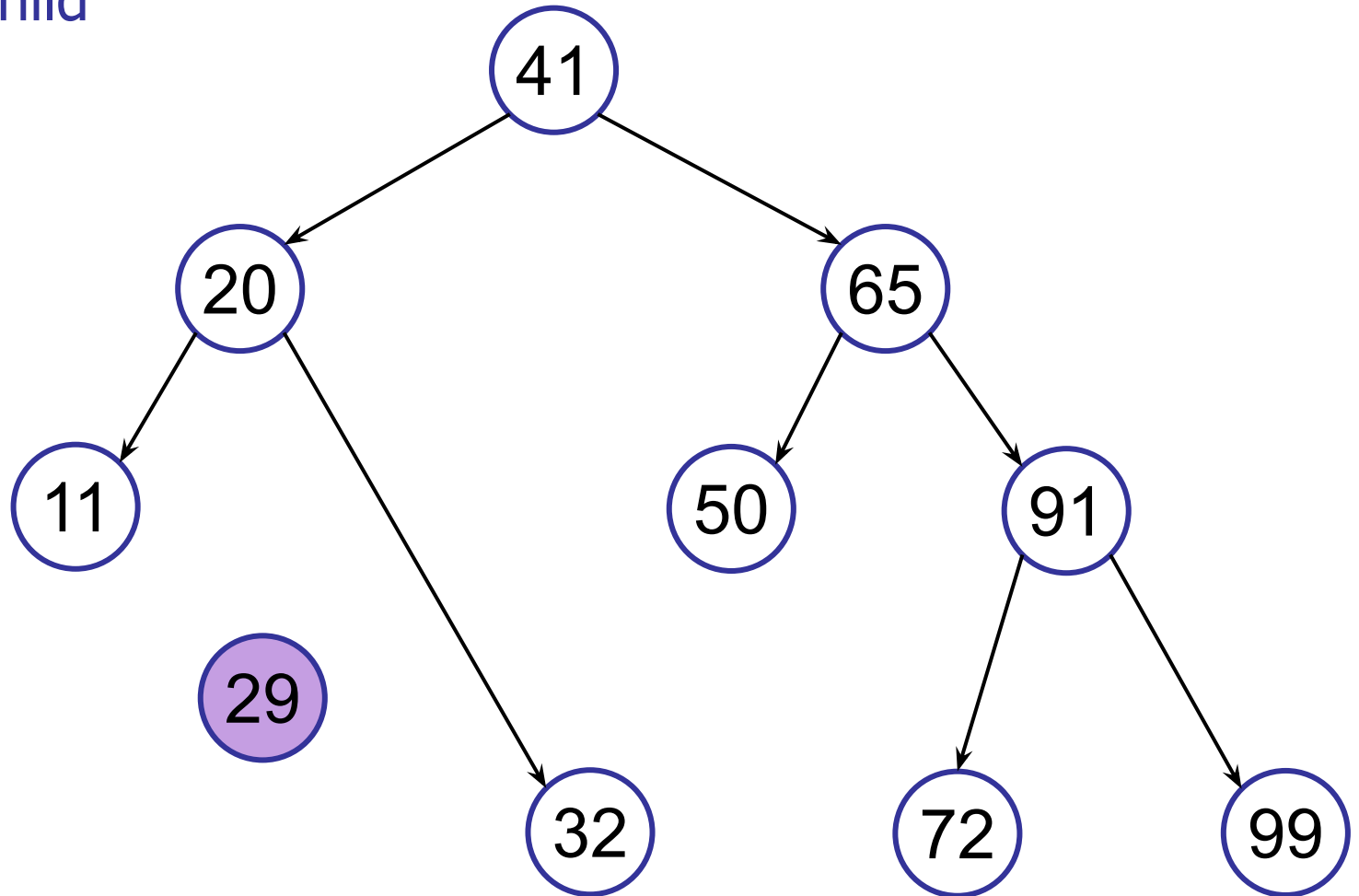


# Binary Search Tree

---

delete(29)

Case 2: 1 child



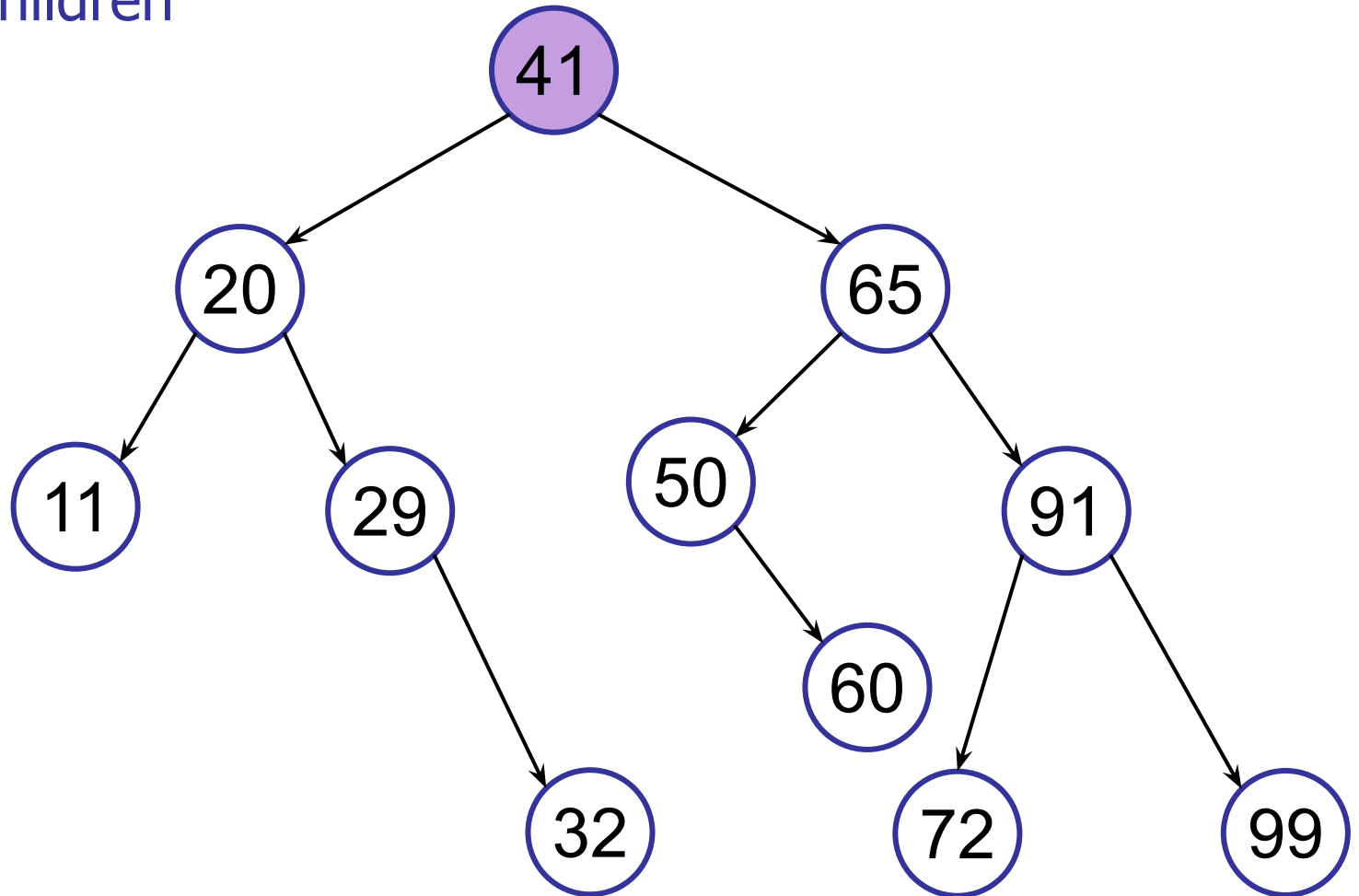


# Binary Search Tree

---

delete(41)

Case 3: 2 children

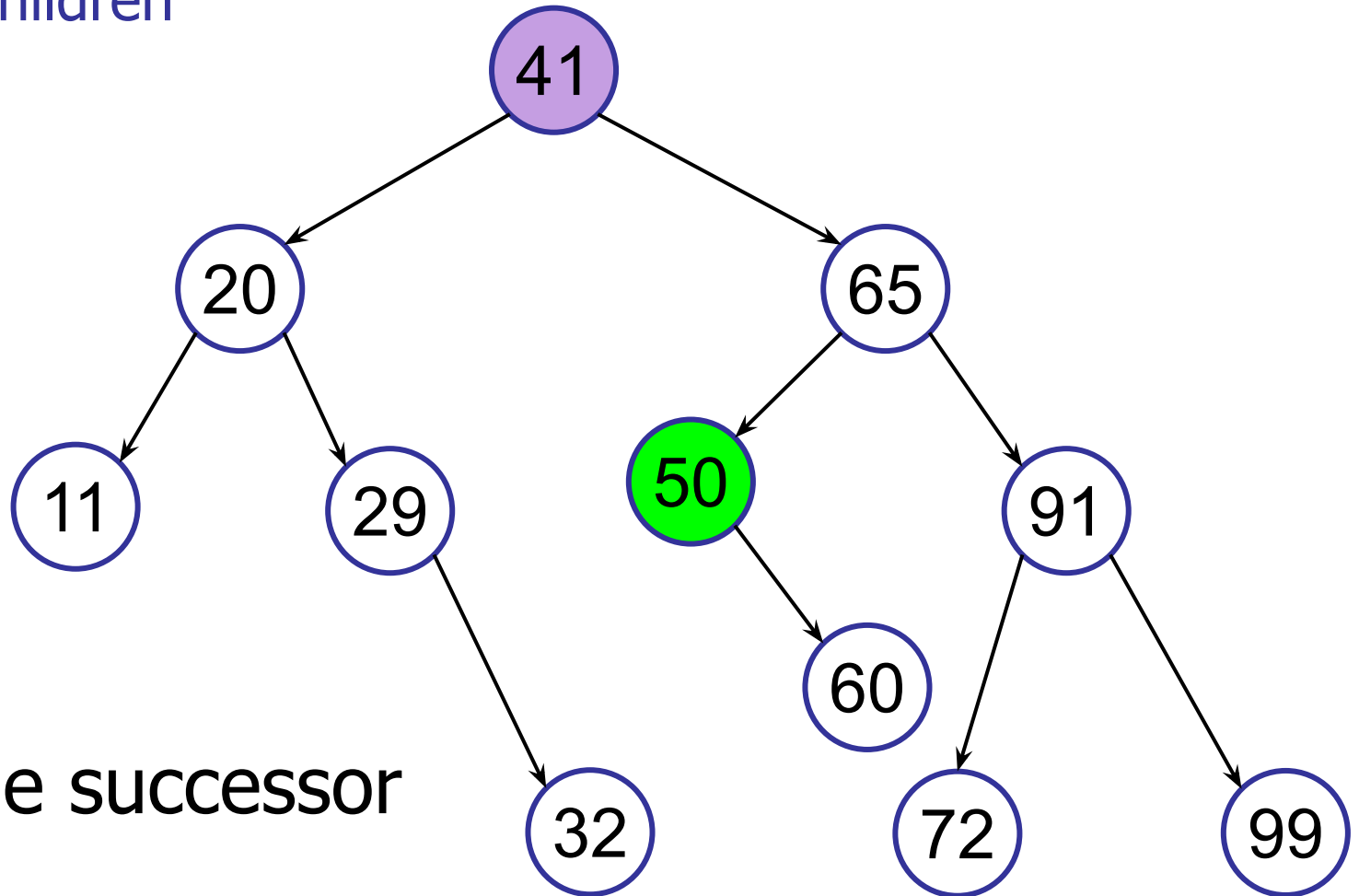


# Binary Search Tree

---

delete(41)

Case 3: 2 children



# Binary Search Tree

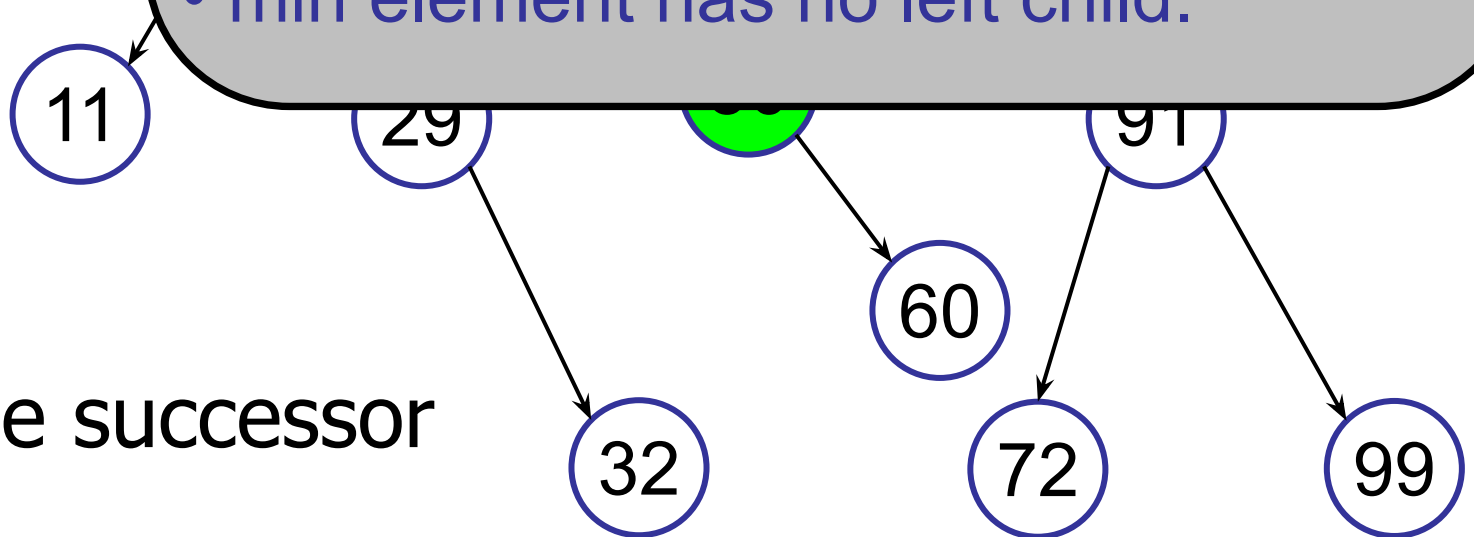
delete(41)

Case 3: 2 children

Claim: successor of deleted node has at most 1 child!

Proof:

- Deleted node has two children.
- Deleted node has a **right** child.
- `successor() = right.findMin()`
- min element has no left child.

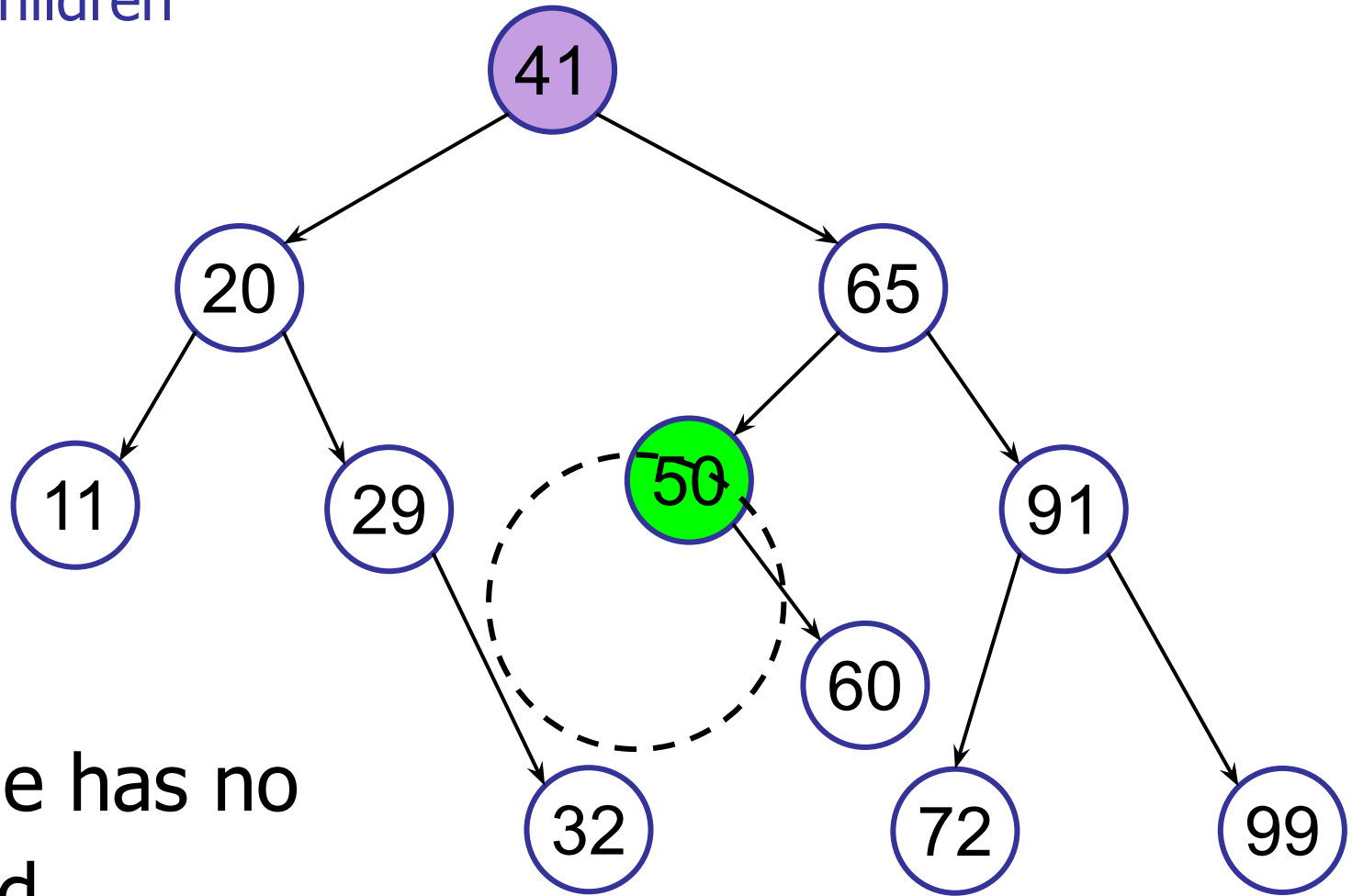


# Binary Search Tree

---

delete(41)

Case 3: 2 children



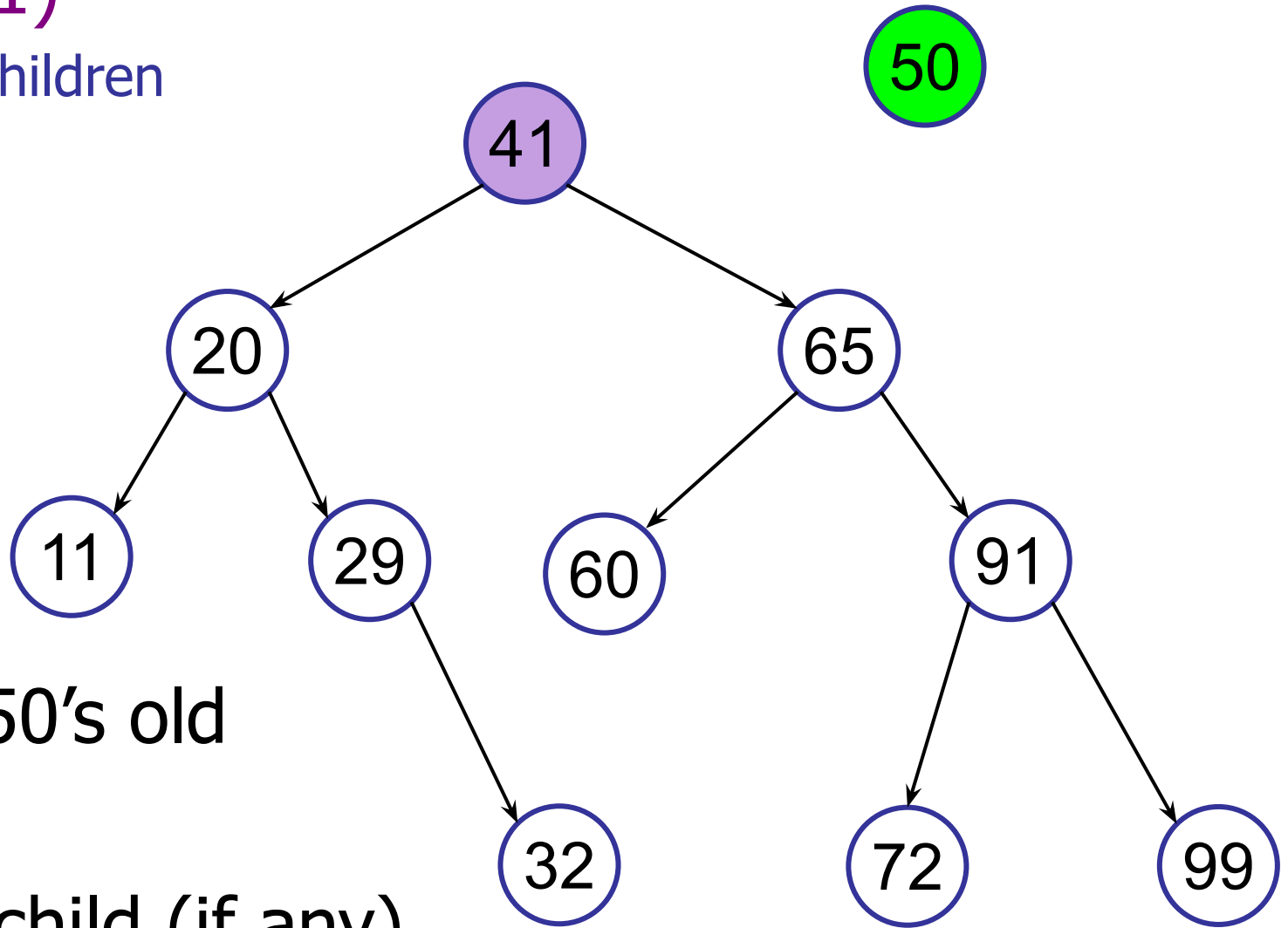
50 is the has no  
left child

# Binary Search Tree

---

delete(41)

Case 3: 2 children



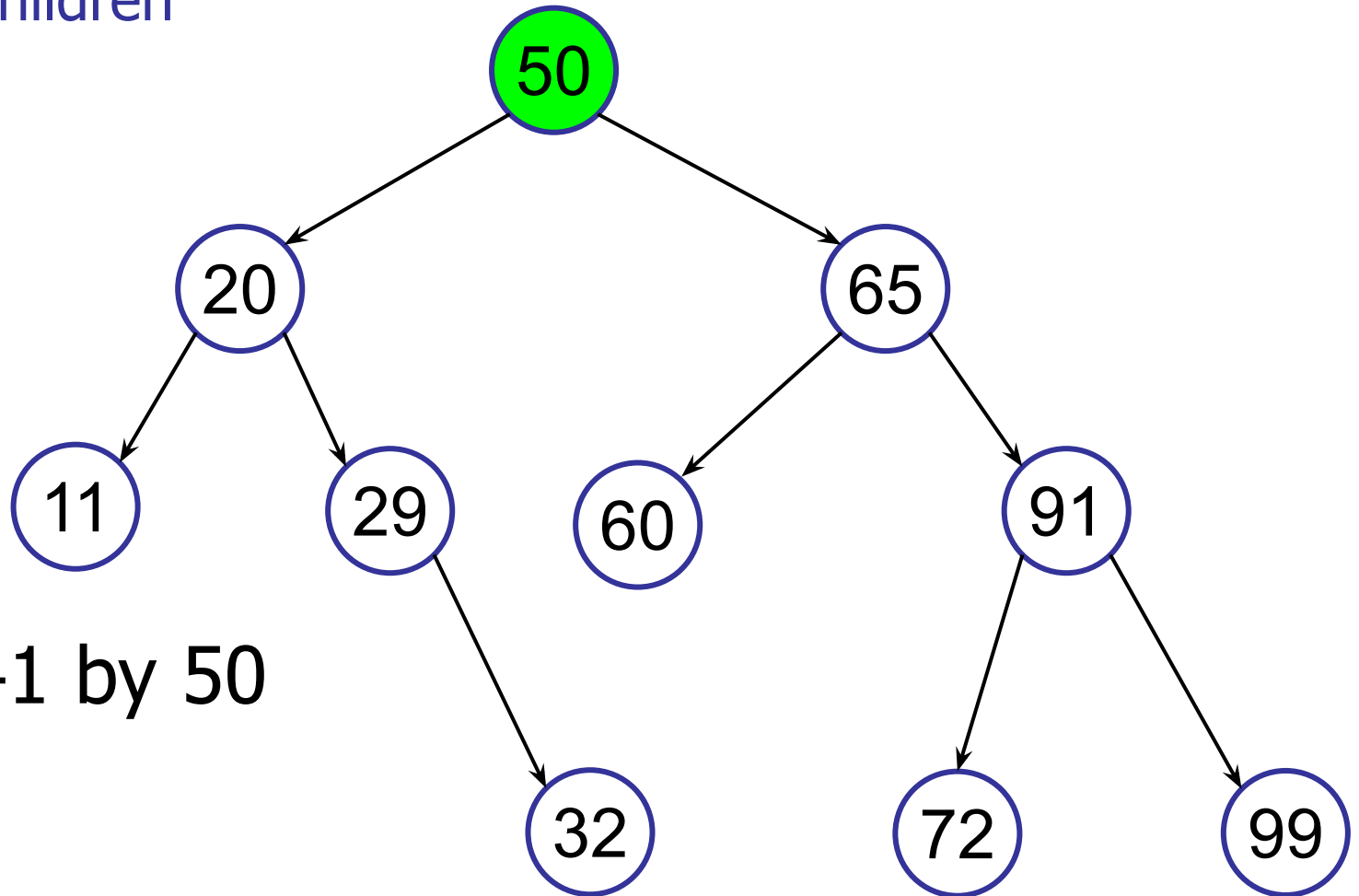
Connect 50's old  
parent to  
the right child (if any).

# Binary Search Tree

---

delete(41)

Case 3: 2 children



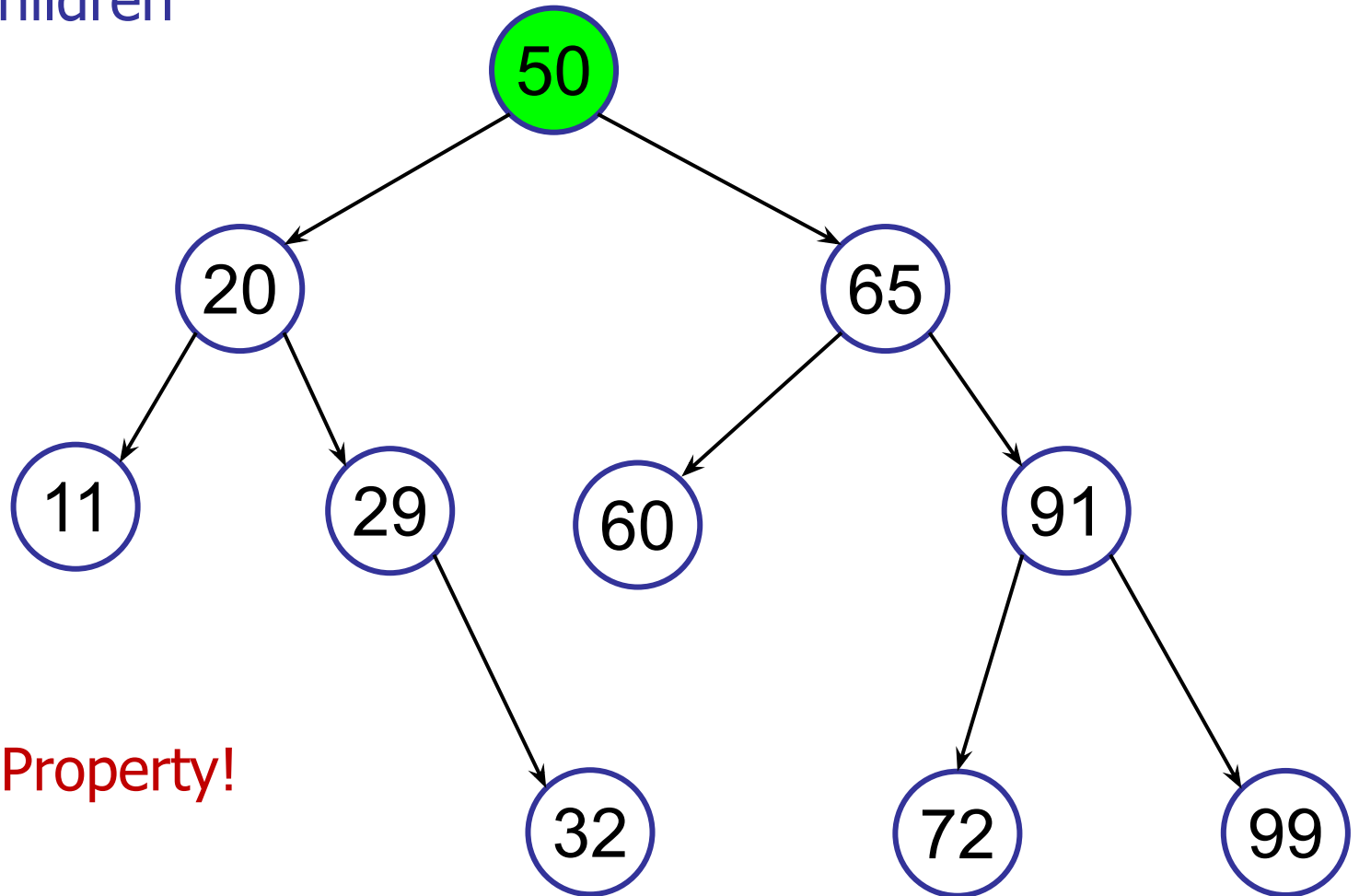
Replace 41 by 50

# Binary Search Tree

---

delete(41)

Case 3: 2 children



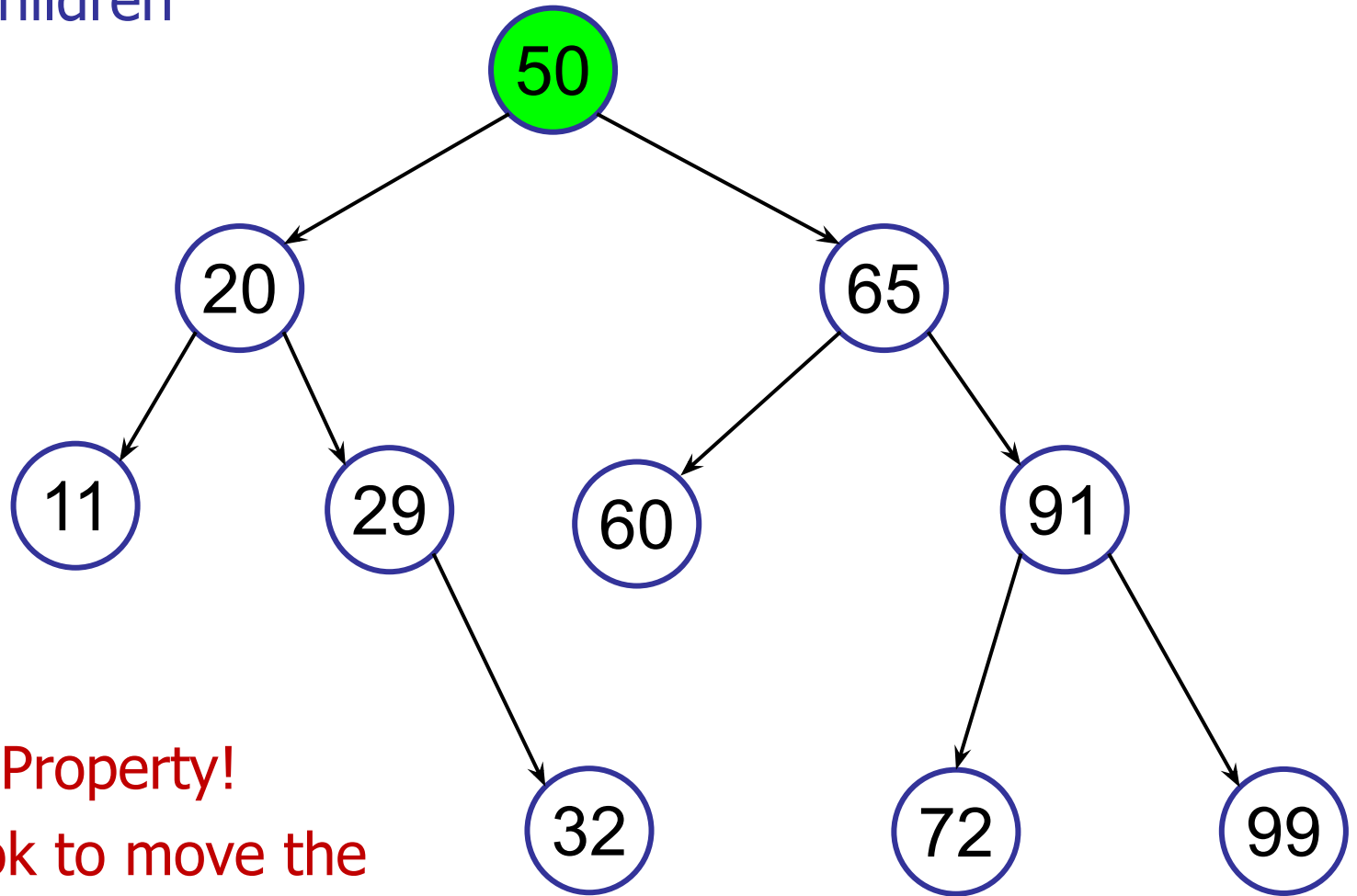
Check BST Property!

# Binary Search Tree

---

delete(41)

Case 3: 2 children



Check BST Property!

Why was it ok to move the  
right subtree of 50 up?



# Binary Search Tree

---

delete(v)

Running time:  $O(\text{height})$

Three cases:

1. No children:
  - remove v
2. 1 child:
  - remove v
  - connect child(v) to parent(v)
3. 2 children
  - $x = \text{successor}(v)$
  - delete(x)
  - remove v
  - connect x to left(v), right(v), parent(v)

# Binary Search Tree

---

## Modifying Operations

- insert:  $O(h)$
- delete:  $O(h)$

## Query Operations:

- search:  $O(h)$
- predecessor, successor:  $O(h)$
- findMax, findMin:  $O(h)$
- in-order-traversal:  $O(n)$

# Plan of the Day

---

## Trees

- Terminology
- Traversals
- Operations

## Balanced Trees

- Height-balanced binary search trees
- AVL trees
- Rotations

# Part 2

---

## On the importance of being balanced



# Part 2

---

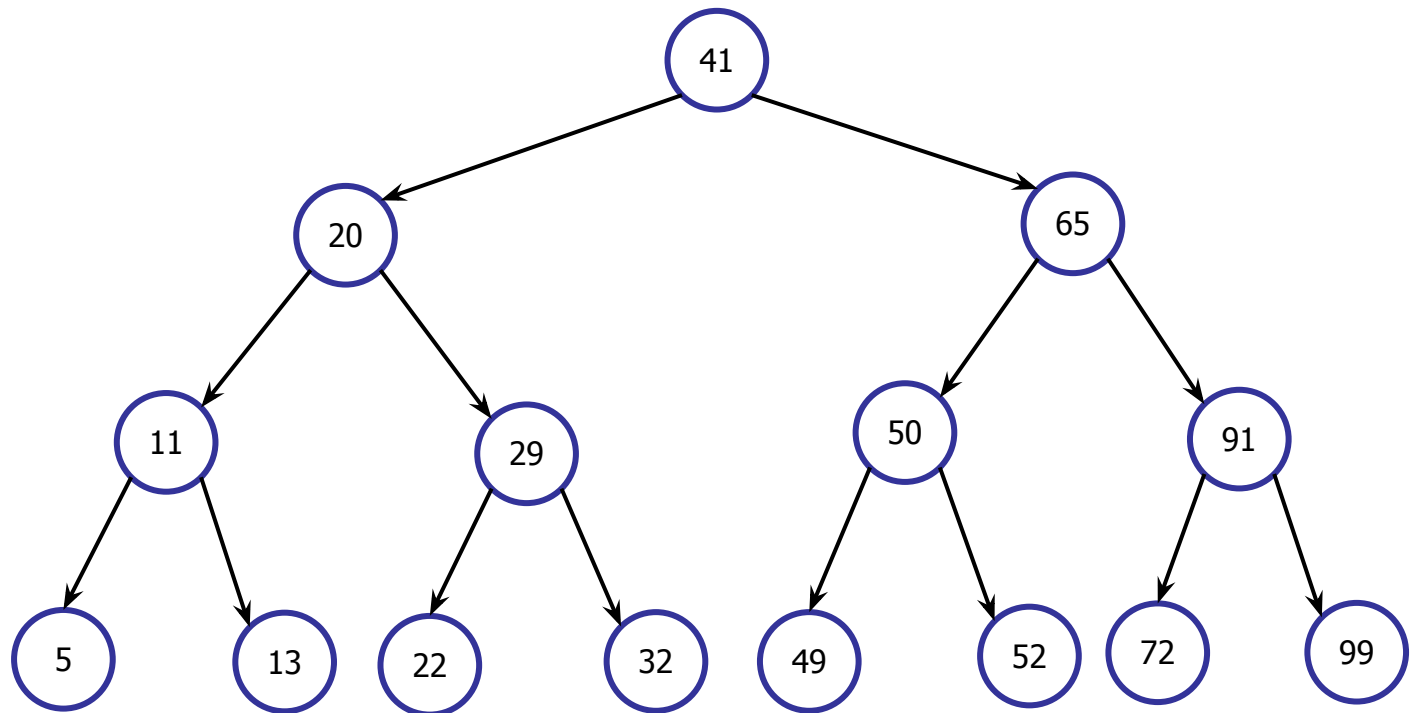
## **On the importance of being balanced**

- Height-balanced binary search trees
- AVL trees
- Rotations

# The Importance of Being Balanced

---

Operations take  $O(\text{height})$  time



What is the largest possible height  $h$ ?

1.  $\Theta(1)$
2.  $\Theta(\log n)$
3.  $\Theta(\sqrt{n})$
4.  $\Theta(n)$
5.  $\Theta(n^2)$

What is the largest possible height  $h$ ?

1.  $\Theta(1)$
2.  $\Theta(\log n)$
3.  $\Theta(\sqrt{n})$
- ✓ 4.  $\Theta(n)$
5.  $\Theta(n^2)$

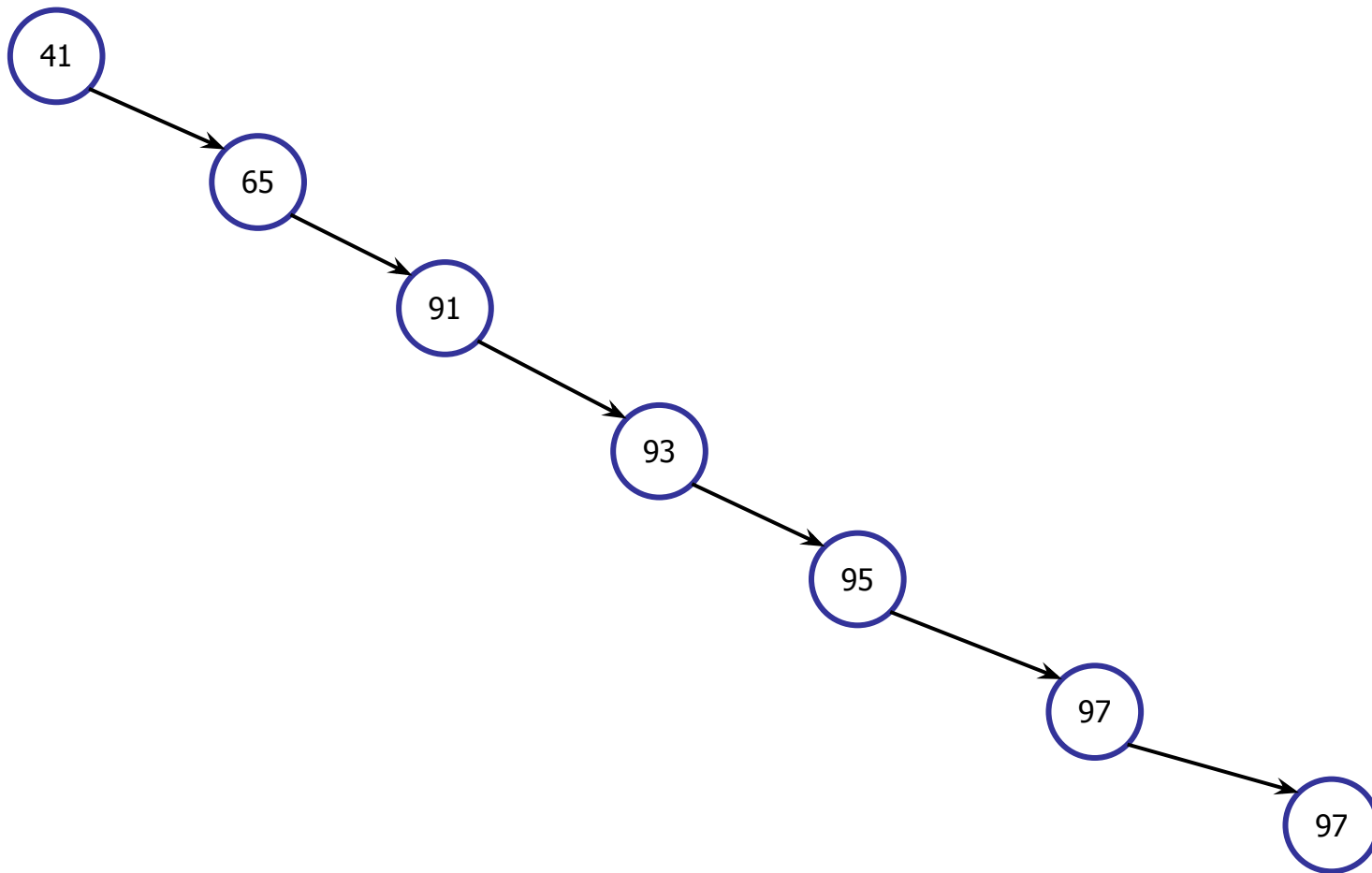


# The Importance of Being Balanced

---

Operations take  $O(h)$  time


$$h \leq n$$



What is the smallest possible height  $h$ ?

1.  $\Theta(1)$
2.  $\Theta(\log \log n)$
3.  $\Theta(\log n)$
4.  $\Theta(\sqrt{n})$
5.  $\Theta(n)$
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What is the smallest possible height  $h$ ?

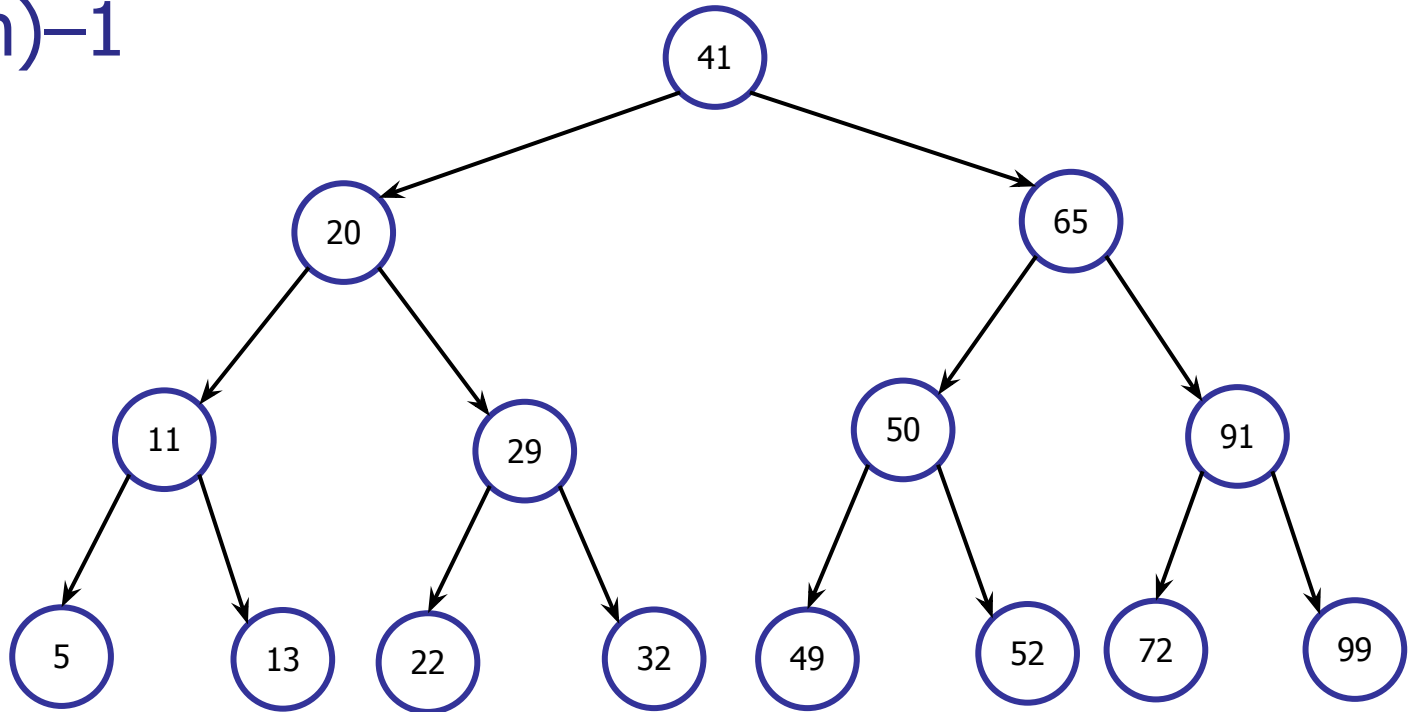
1.  $\Theta(1)$
2.  $\Theta(\log \log n)$
-  3.  $\Theta(\log n)$
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5.  $\Theta(n)$
6.  $\Theta(n^2)$

# The Importance of Being Balanced

---

Operations take  $O(h)$  time

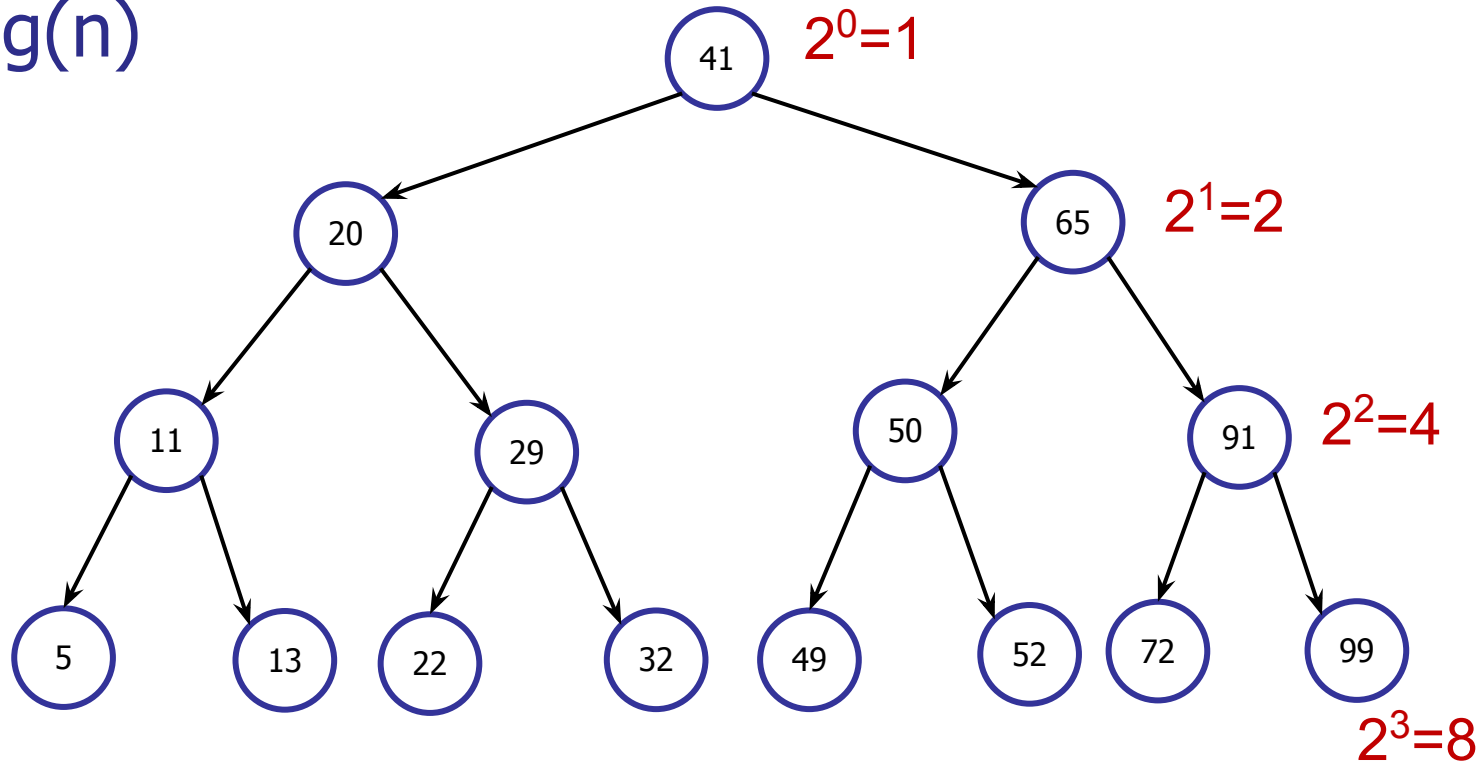
$$h \geq \log(n)-1$$



# The Importance of Being Balanced

Operations take  $O(h)$  time

$$h+1 \geq \log(n)$$



$$\begin{aligned} n &\leq 1 + 2 + 4 + \dots + 2^h \\ &\leq 2^0 + 2^1 + 2^2 + \dots + 2^h < 2^{h+1} \end{aligned}$$

# The Importance of Being Balanced

---

Operations take  $O(h)$  time

$$\log(n) - 1 \leq h \leq n$$

*Key definition*

A BST is balanced if  $h = O(\log n)$

On a balanced BST: all operations run in  $O(\log n)$  time.

# The Importance of Being Balanced

---

Operations take  $O(h)$  time

$$\log(n) - 1 \leq h \leq n$$

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A BST is balanced if  $h = O(\log n)$

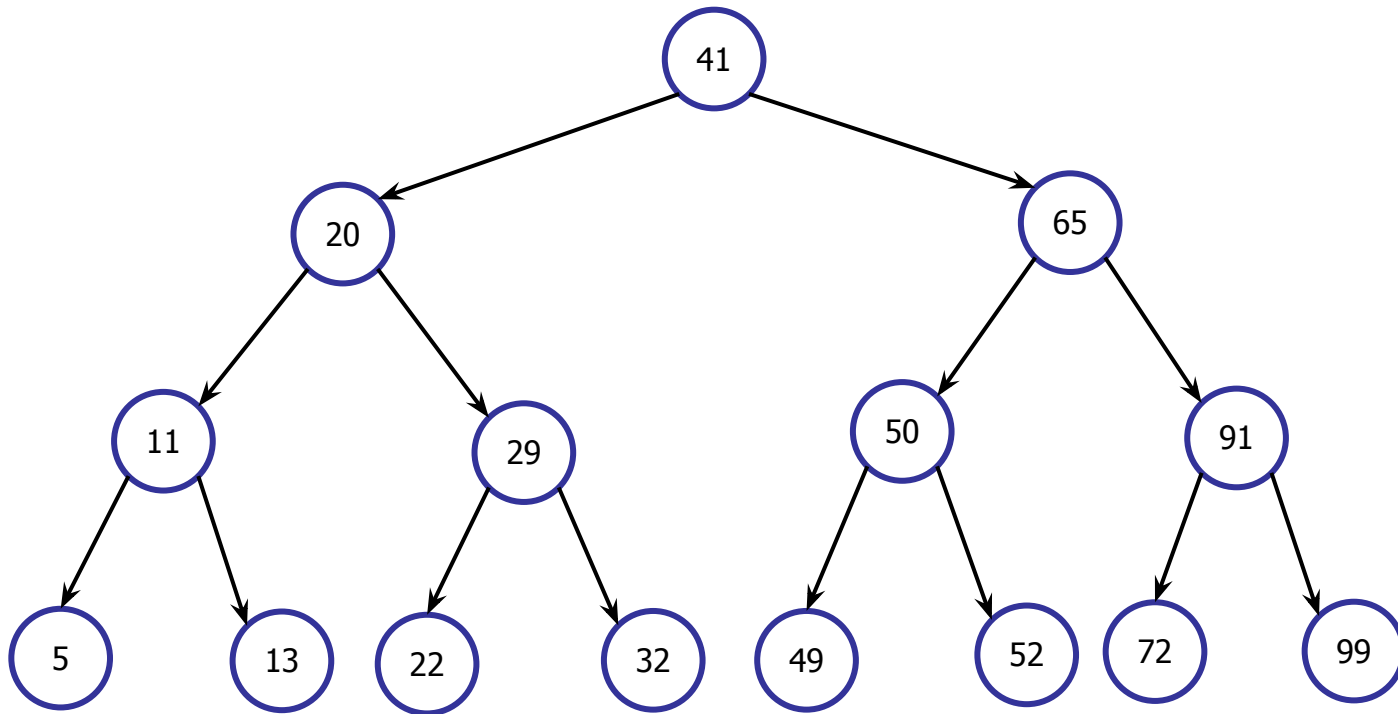
On a balanced BST: all operations run in  $O(\log n)$  time.

Side note: Items might be closer to the root, operations on those items might take less than  $O(\log n)$  time.

# The Importance of Being Balanced

---

Perfectly balanced:

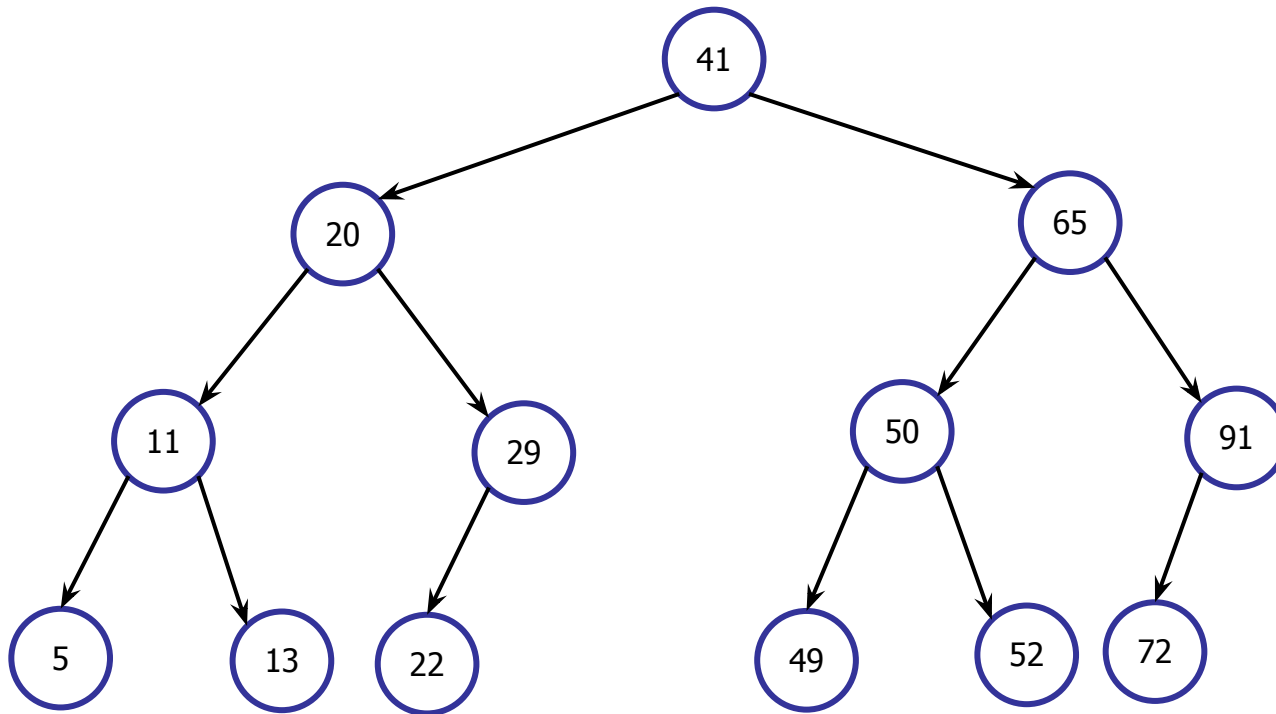




# The Importance of Being Balanced

---

Almost perfectly balanced:

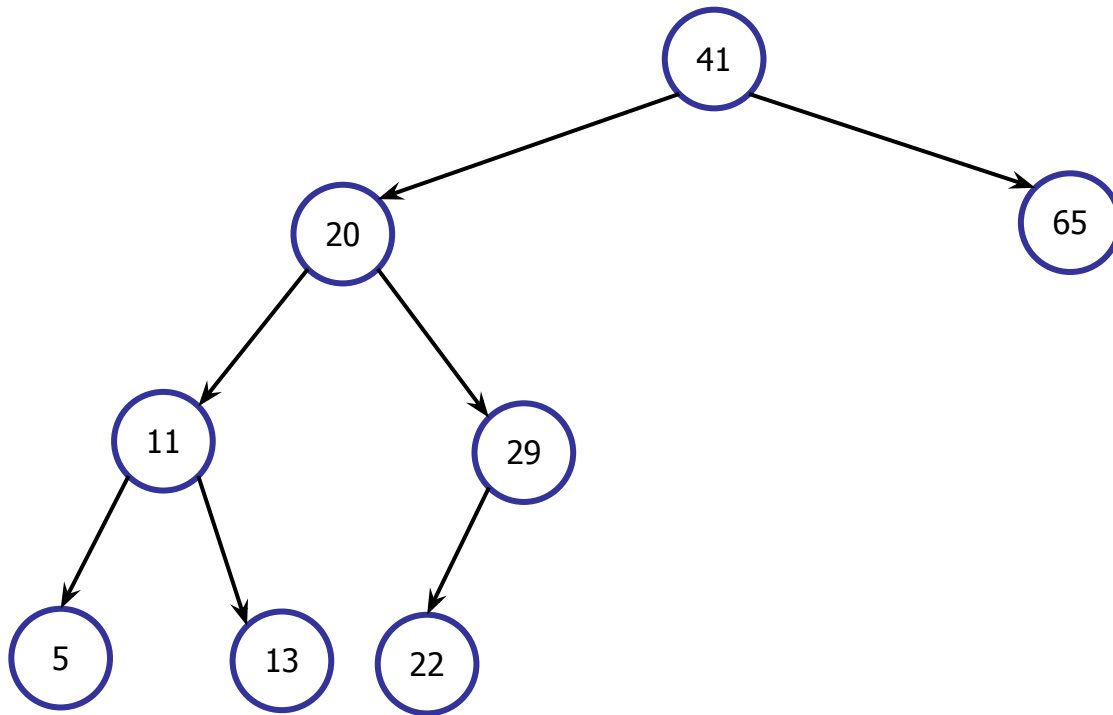


Every subtree has (almost) the same number of nodes.

# The Importance of Being Balanced

---

Not perfectly balanced:



Left tree has 6, right tree has 1.

# Balanced Search Trees

---

Many different flavors of balanced search trees

- AVL trees (Adelson-Velsii & Landis, 1962)
- B-trees / 2-3-4 trees (Bayer & McCreight, 1972)
- BB[a] trees (Nievergelt & Reingold 1973)
- Red-black trees (see CLRS 13)
- Splay trees (Sleator and Tarjan 1985)
- Treaps (Seidel and Aragon 1996)
- Skip Lists (Pugh 1989)
- Scapegoat Trees (Anderson 1989)

# Balanced Search Trees

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Many different flavors of balanced search trees

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- Skip Lists (Pugh 1989)
- Scapegoat Trees (Anderson 1989)

# The Importance of Being Balanced

---

How to get a balanced tree:

- Define a good property of a tree.
- Show that if the good property holds, then the tree is **balanced**.
- After every insert/delete, make sure the good property still holds. If not, fix it.



Invariant

# AVL Trees [Adelson-Velskii & Landis 1962]

---



# AVL Trees [Adelson-Velskii & Landis 1962]

---

Step 0: Augment 

Step 1: Define Height Balance

Step 2: Maintain Balance

# AVL Trees [Adelson-Velskii & Landis 1962]

---

## Step 0: Augment

- In every node  $v$ , store height:  
$$v.\text{height} = h(v)$$



# AVL Trees [Adelson-Velskii & Landis 1962]

---

## Step 0: Augment

- In every node  $v$ , store height:  
$$v.\text{height} = h(v)$$

Why? Because then we don't have to recompute it when we need it.

# AVL Trees [Adelson-Velskii & Landis 1962]

---

## Step 0: Augment

- In every node  $v$ , store height:  
$$v.\text{height} = h(v)$$
- On insert & delete operations, update height:

```
insert(x)
```

```
    if (x < key)
```

```
        left.insert(x)
```

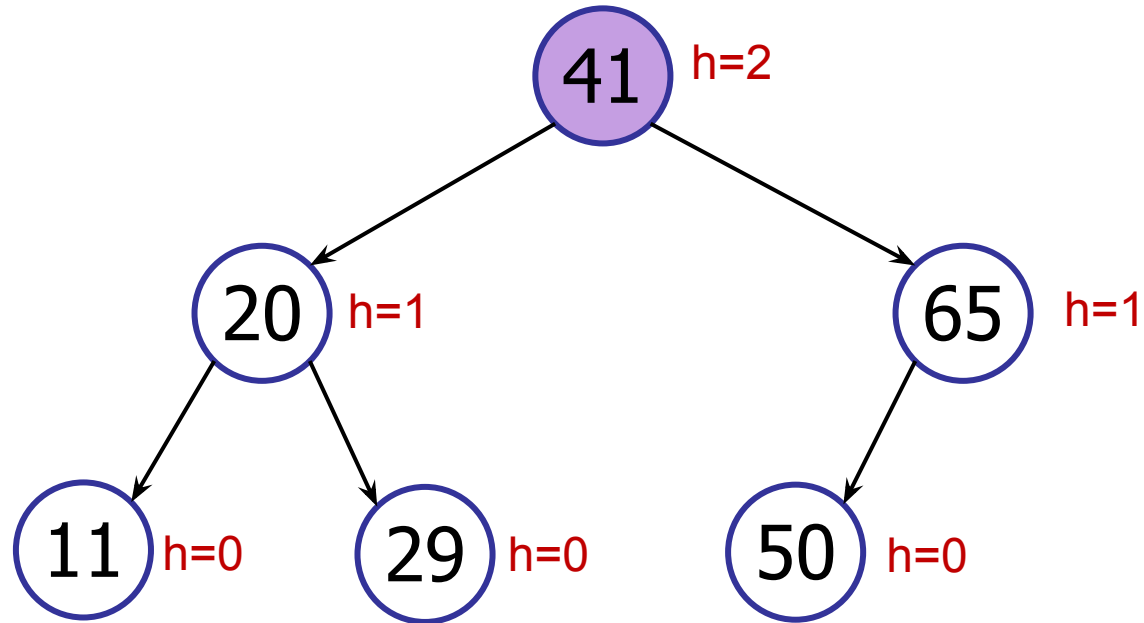
```
    else right.insert(x)
```

```
    height = max(left.height, right.height) + 1
```

# Binary Search Trees

---

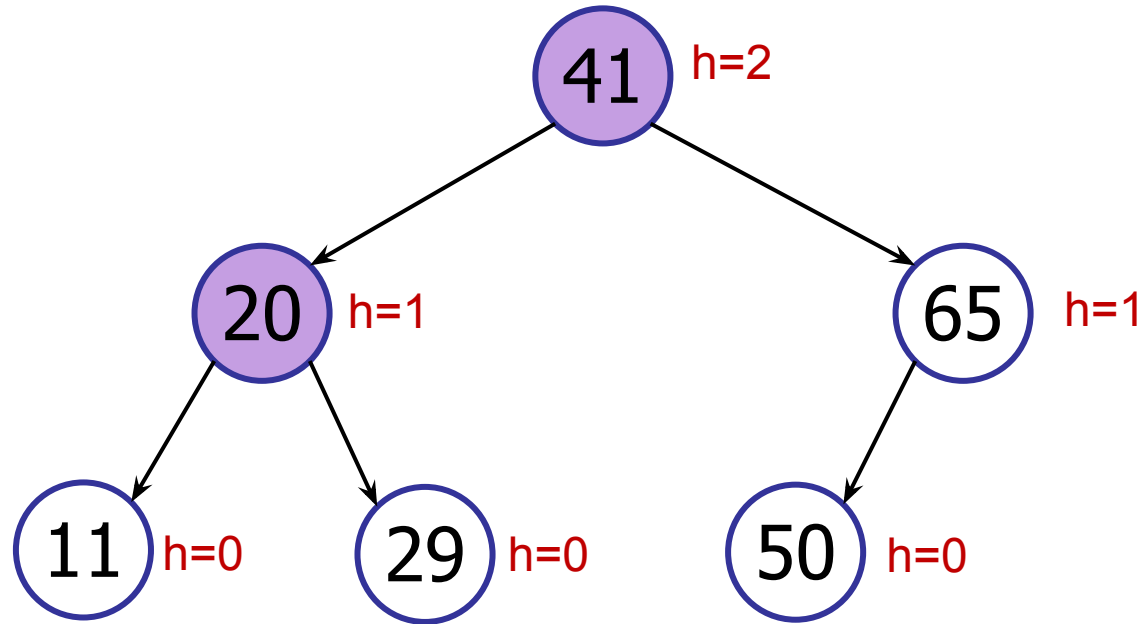
insert(27)



# Binary Search Trees

---

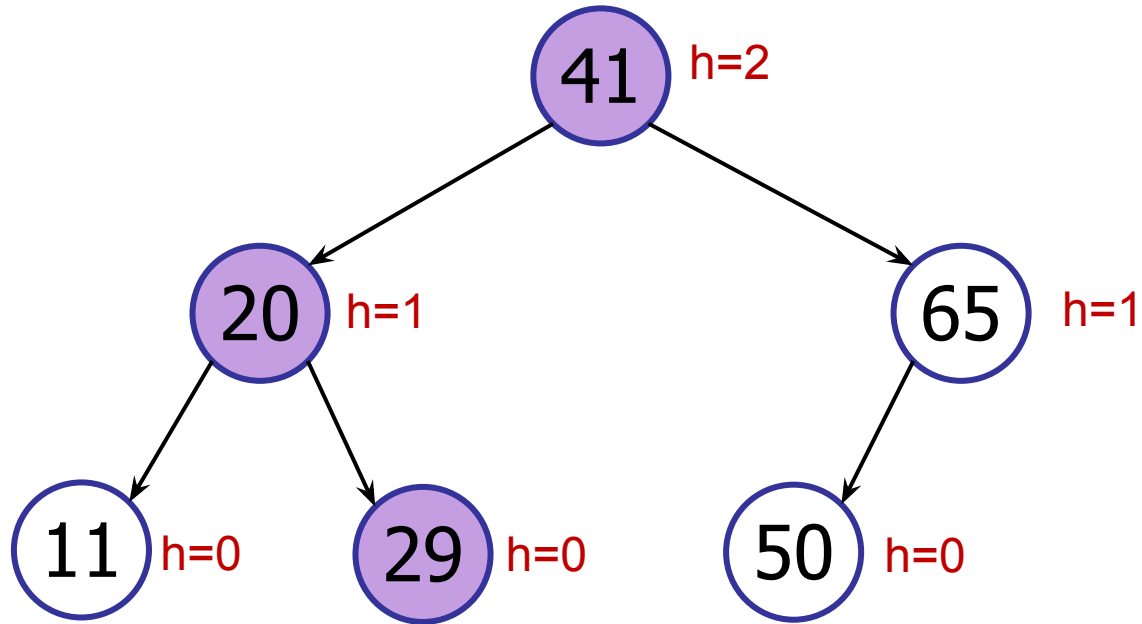
insert(27)



# Binary Search Trees

---

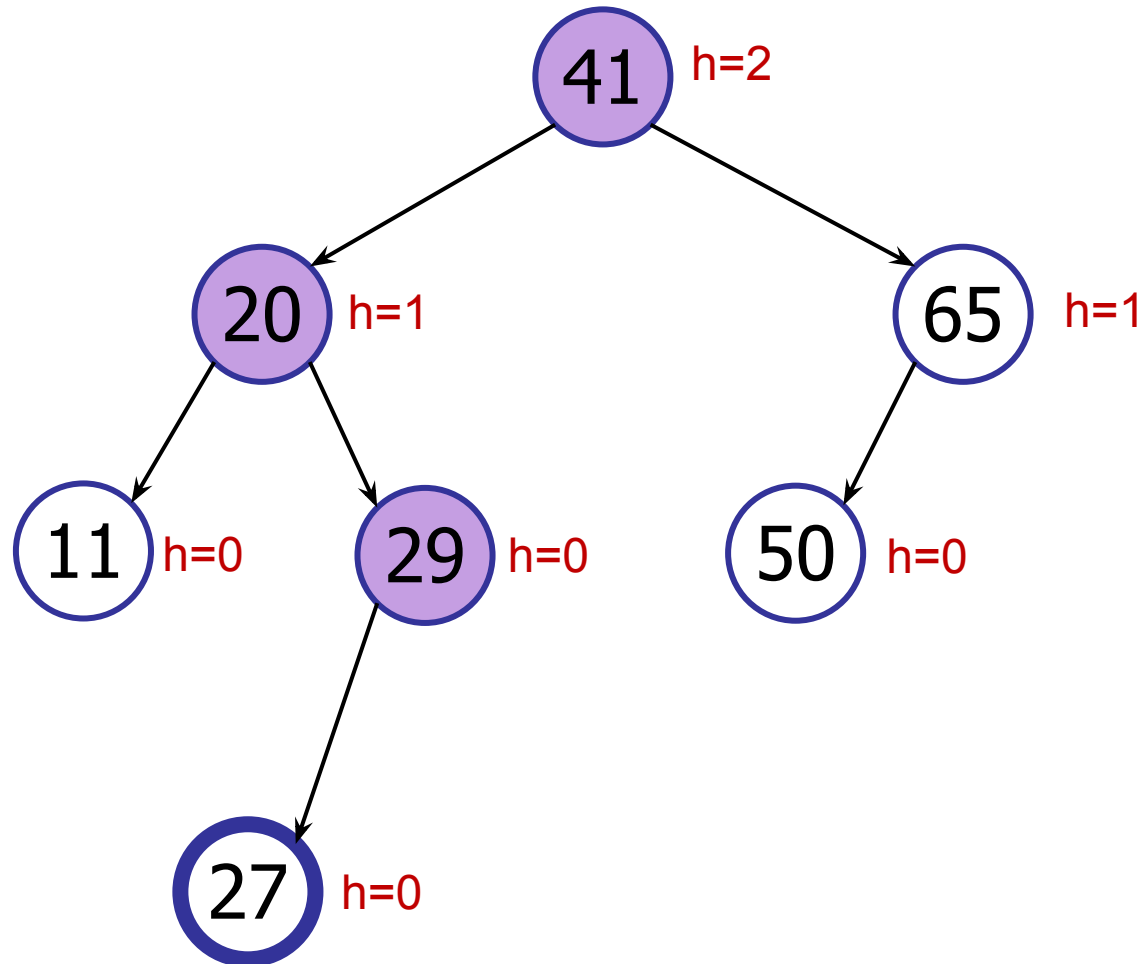
insert(27)



# Binary Search Trees

---

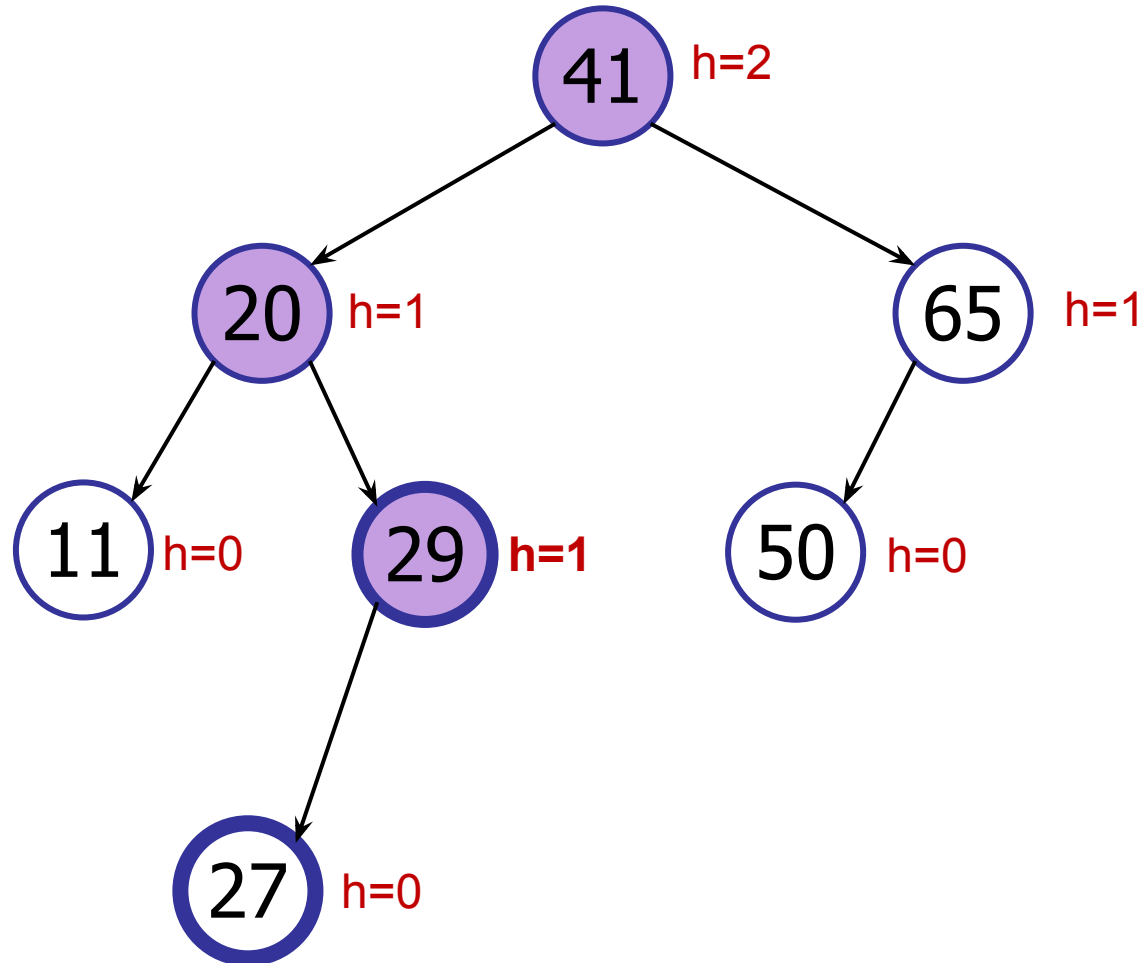
insert(27)



# Binary Search Trees

---

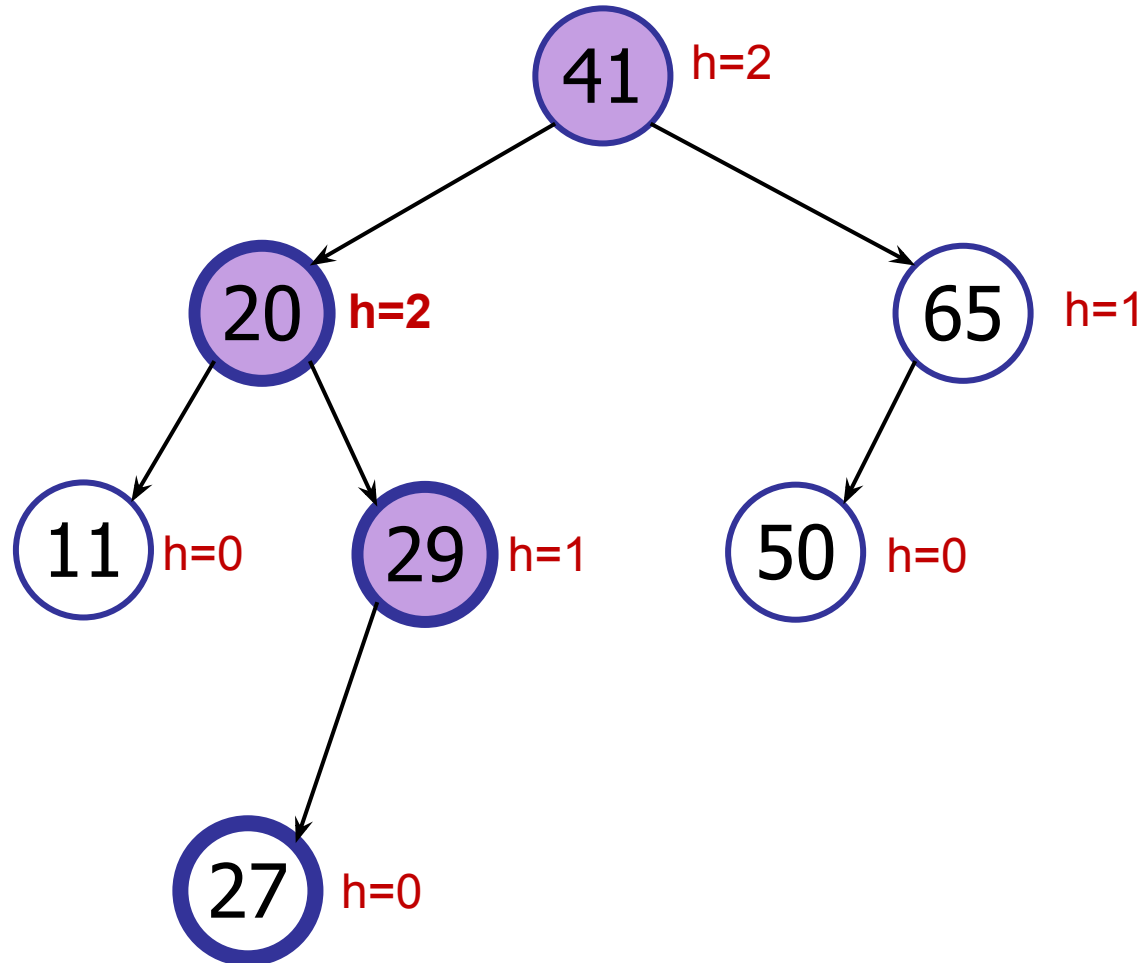
insert(27)



# Binary Search Trees

---

insert(27)

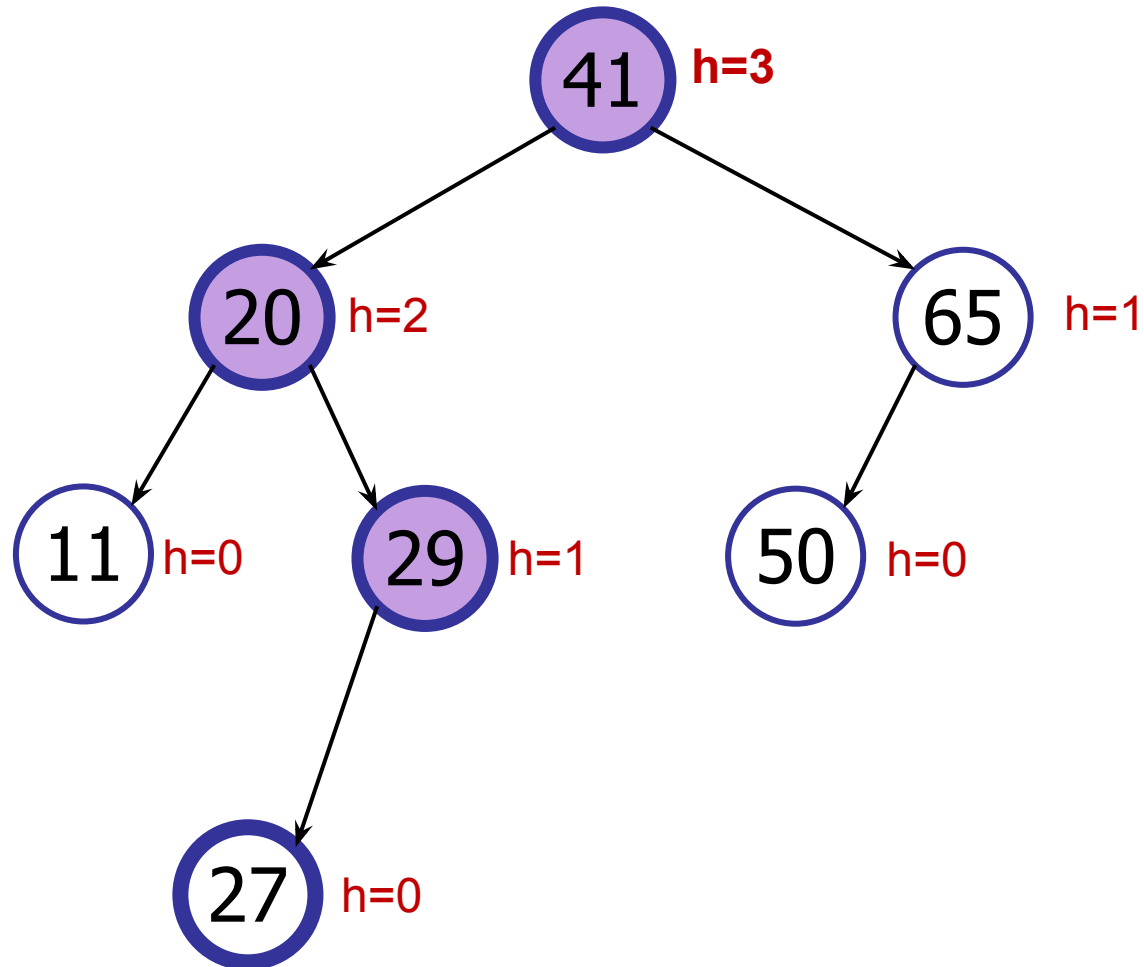




# Binary Search Trees

---

insert(27)



# AVL Trees [Adelson-Velskii & Landis 1962]

---

## Step 0: Augment

- In every node  $v$ , store height:  
 $v.\text{height} = h(v)$
- On insert & delete update height:

```
insert(x)
```

```
  if (x < key)
```

```
    left.insert(x)
```

```
  else right.insert(x)
```

```
  height = max(left.height, right.height) + 1
```

# AVL Trees [Adelson-Velskii & Landis 1962]

---

Step 0: Augment

Step 1: Define Height Balance 

Step 2: Maintain Balance

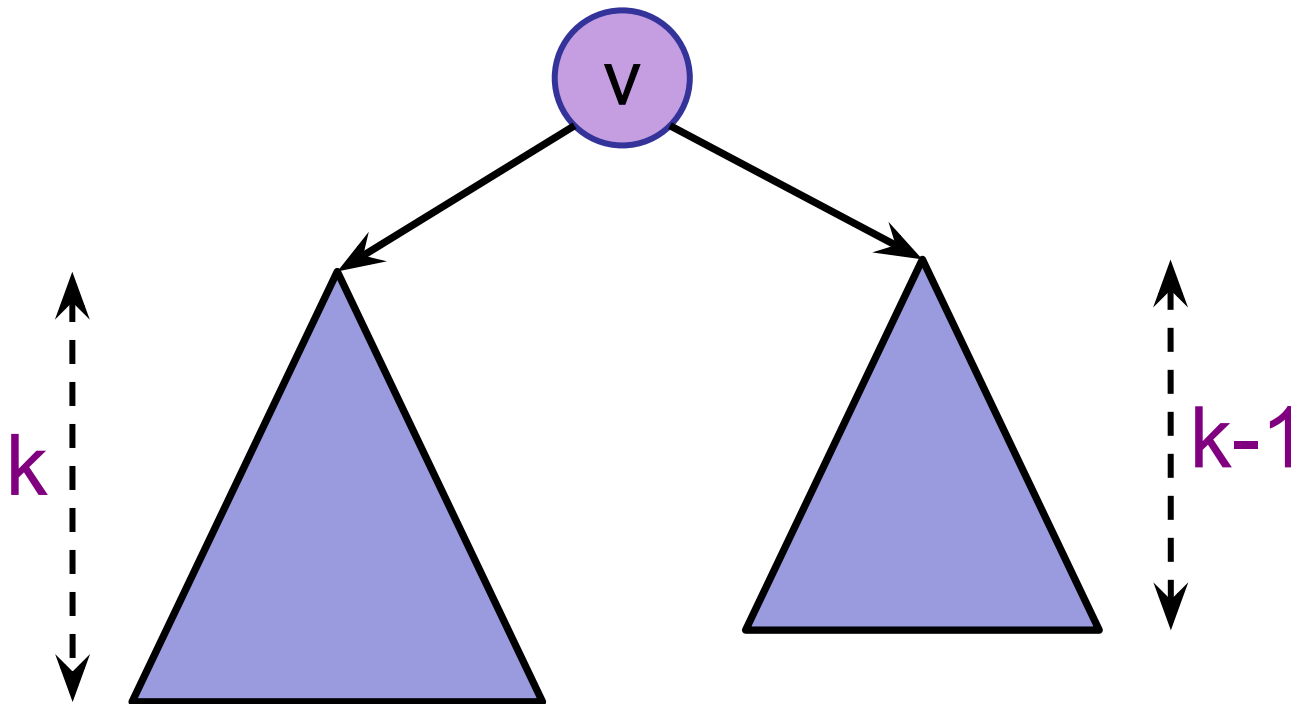
# AVL Trees [Adelson-Velskii & Landis 1962]

## Step 1: Define Invariant

- A node  $v$  is **height-balanced** if:

$$|v.\text{left.height} - v.\text{right.height}| \leq 1$$

Key definition



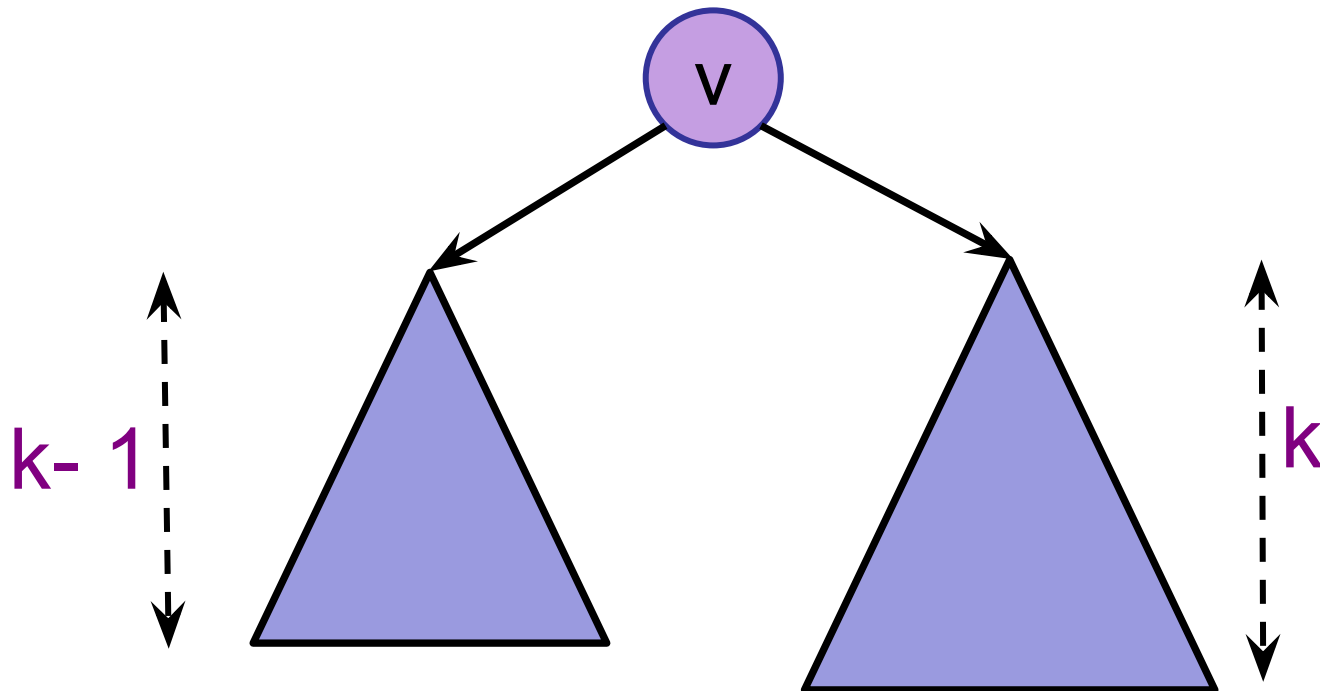
# AVL Trees [Adelson-Velskii & Landis 1962]

## Step 1: Define Invariant

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Key definition



# AVL Trees [Adelson-Velskii & Landis 1962]

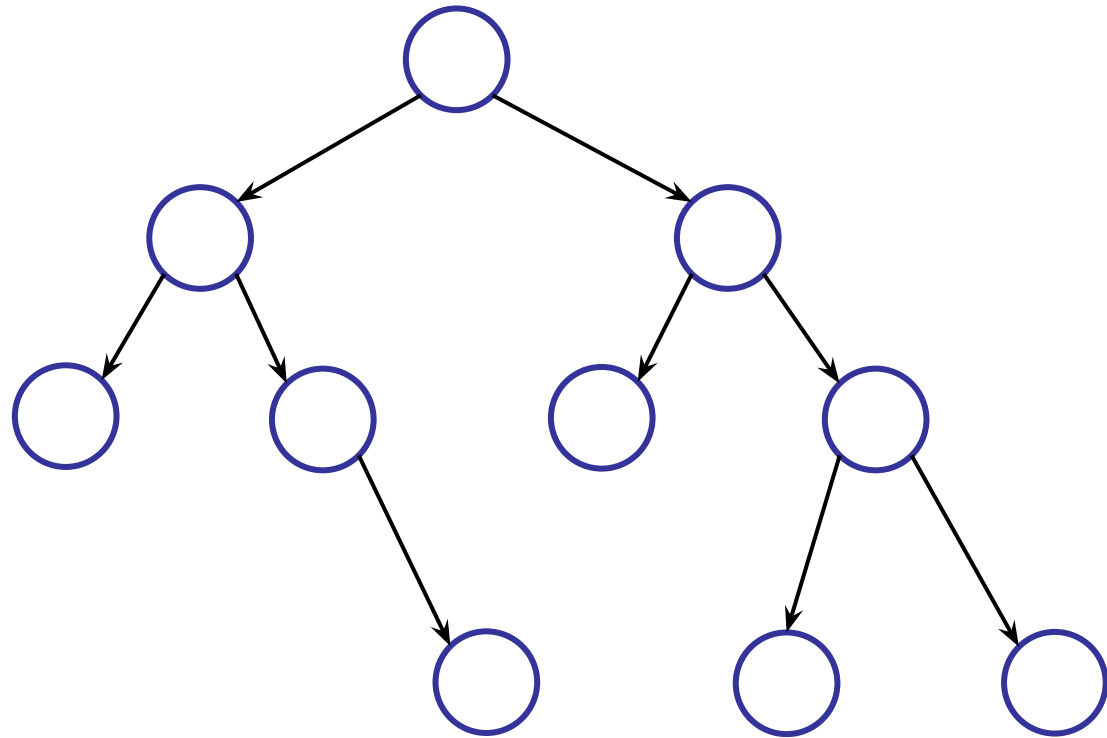
---

## Step 1: Define Invariant

- A node  $v$  is height-balanced if:  
$$|v.\text{left.height} - v.\text{right.height}| \leq 1$$
- A binary search tree is height balanced if **every** node in the tree is height-balanced.

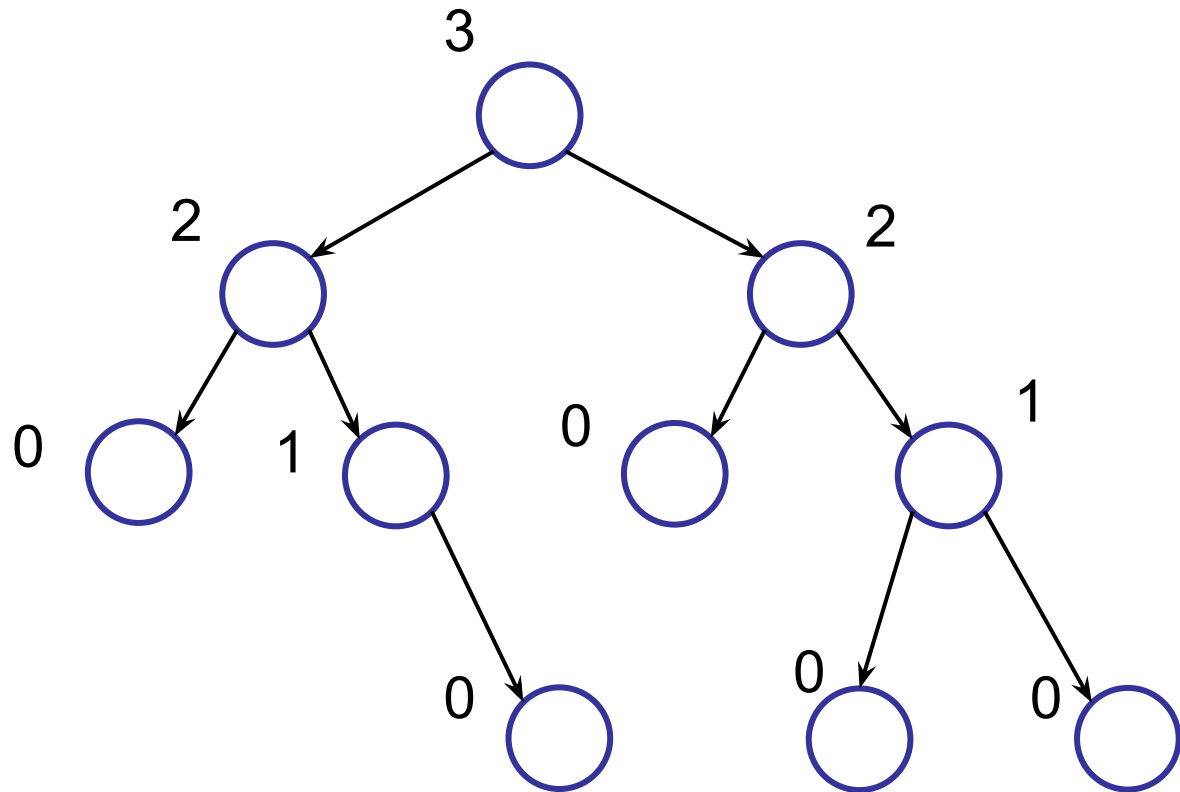
Is this tree height-balanced?

1. Yes
2. No
3. I'm confused.



# Is this tree height-balanced?

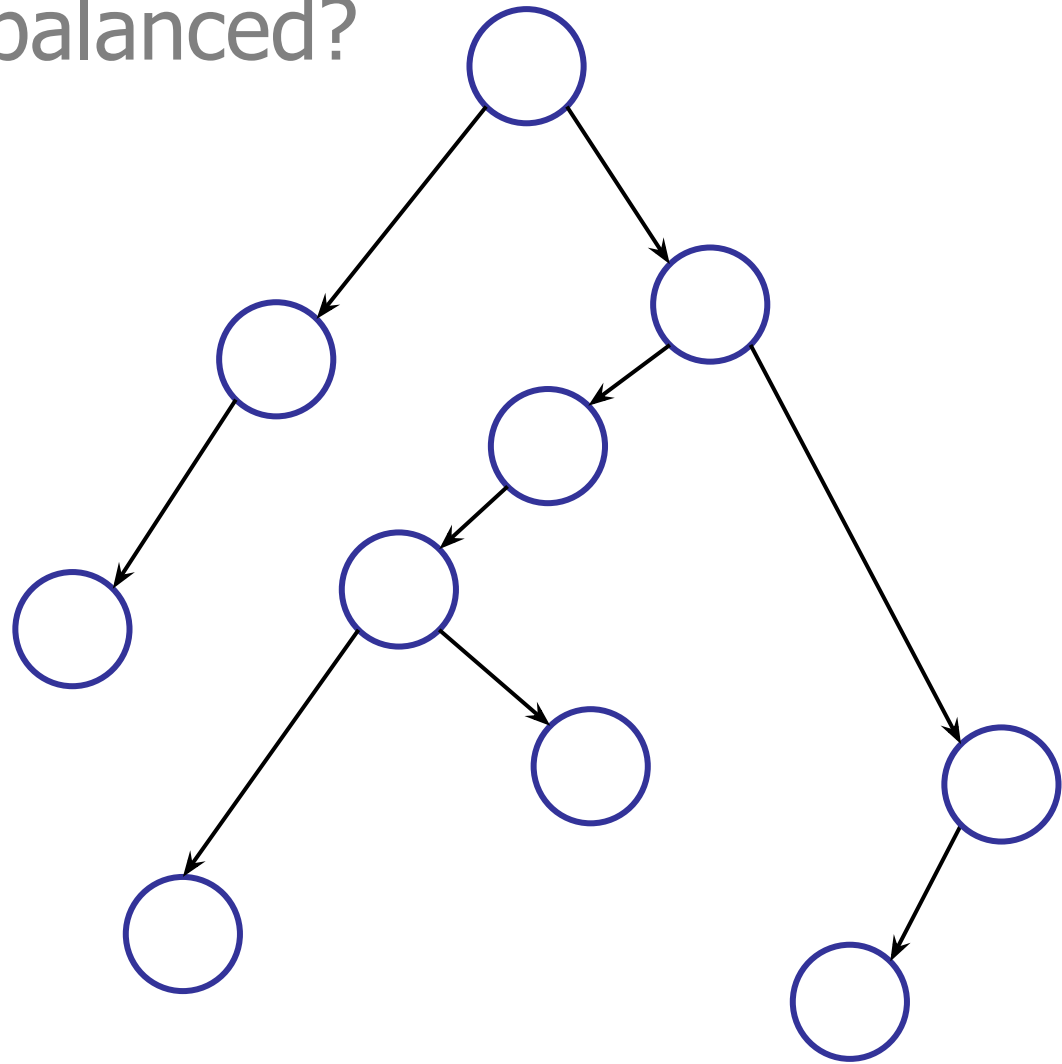
- ✓ 1. Yes
- 2. No
- 3. I'm confused.





Is this tree height-balanced?

1. Yes
2. No
3. I'm confused.

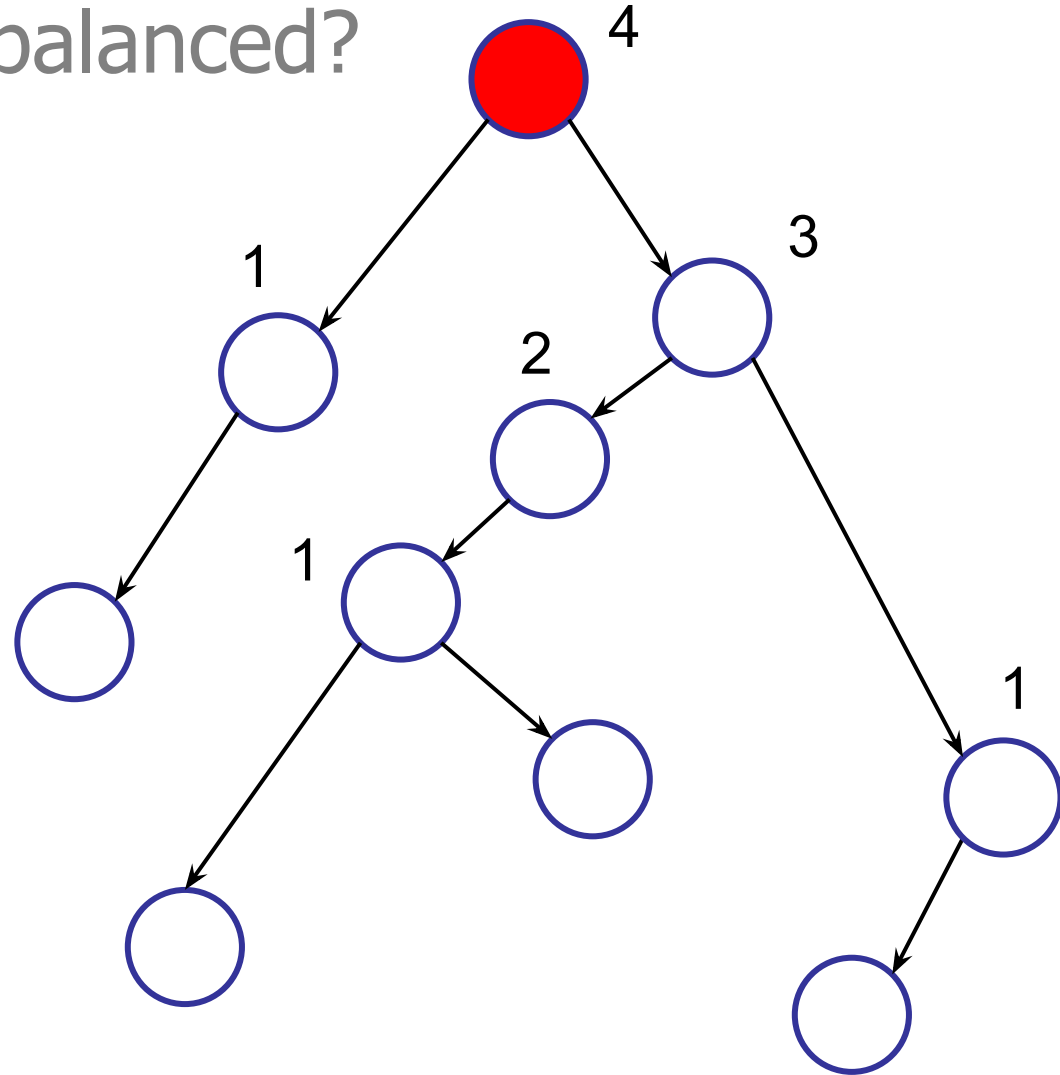


Is this tree height-balanced?

1. Yes

✓ 2. No

3. I'm confused.



# Height-Balanced Trees

---

Claim:

A height-balanced tree with  $n$  nodes has at most height  $h < 2\log(n)$ .

# Height-Balanced Trees

---

Claim:

A height-balanced tree with  $n$  nodes has at most height  $h < 2\log(n)$ .

If we can prove this fact, we can say our operations cost  $O(h) = O(\log n)$  time.

# Height-Balanced Trees

---

Claim:

A height-balanced tree with  $n$  nodes has **at most** height  $h < 2\log(n)$ .

$$\Leftrightarrow h/2 < \log(n)$$

$$\Leftrightarrow 2^{h/2} < 2^{\log(n)}$$

$$\Leftrightarrow 2^{h/2} < n$$

**Equivalent claim:**

A height-balanced tree with height  $h$  has **at least**  $n > 2^{h/2}$  nodes

# Height-Balanced Trees

---

Claim:

A height-balanced tree with  $n$  nodes has **at most** height  $h < 2\log(n)$ .

$$\Leftrightarrow h/2 < \log(n)$$

$$\Leftrightarrow 2^{h/2} < 2^{\log(n)}$$

$$\Leftrightarrow 2^{h/2} < n$$

We will prove this claim  
instead

**Equivalent claim:**

A height-balanced tree with height  $h$  has **at least**  $n > 2^{h/2}$  nodes

# Height-Balanced Trees

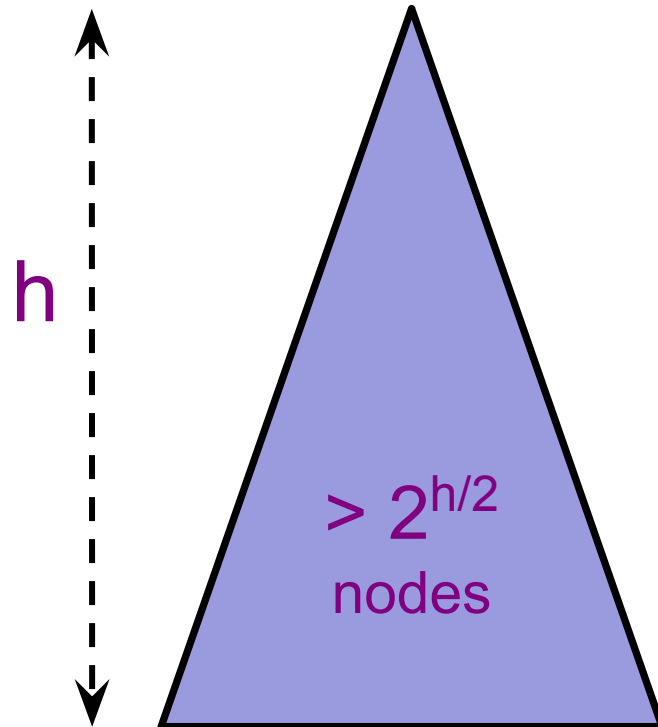
---

Proof:

Let  $n_h$  be the minimum number of nodes in a height-balanced tree of height  $h$ .

Show:

$$n_h > 2^{h/2}$$



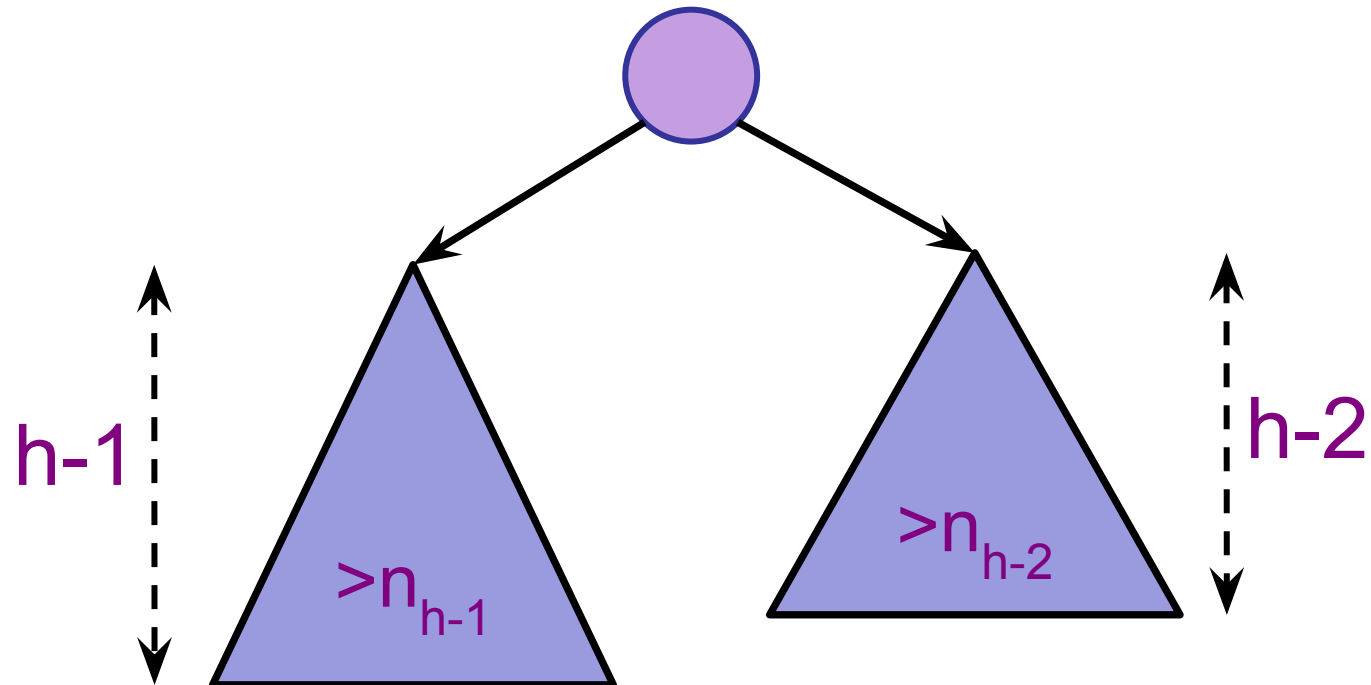
# Height-Balanced Trees

---

Proof:

Let  $n_h$  be the minimum number of nodes in a height-balanced tree of height  $h$ .

$$n_h \geq 1 + n_{h-1} + n_{h-2}$$





# Height-Balanced Trees

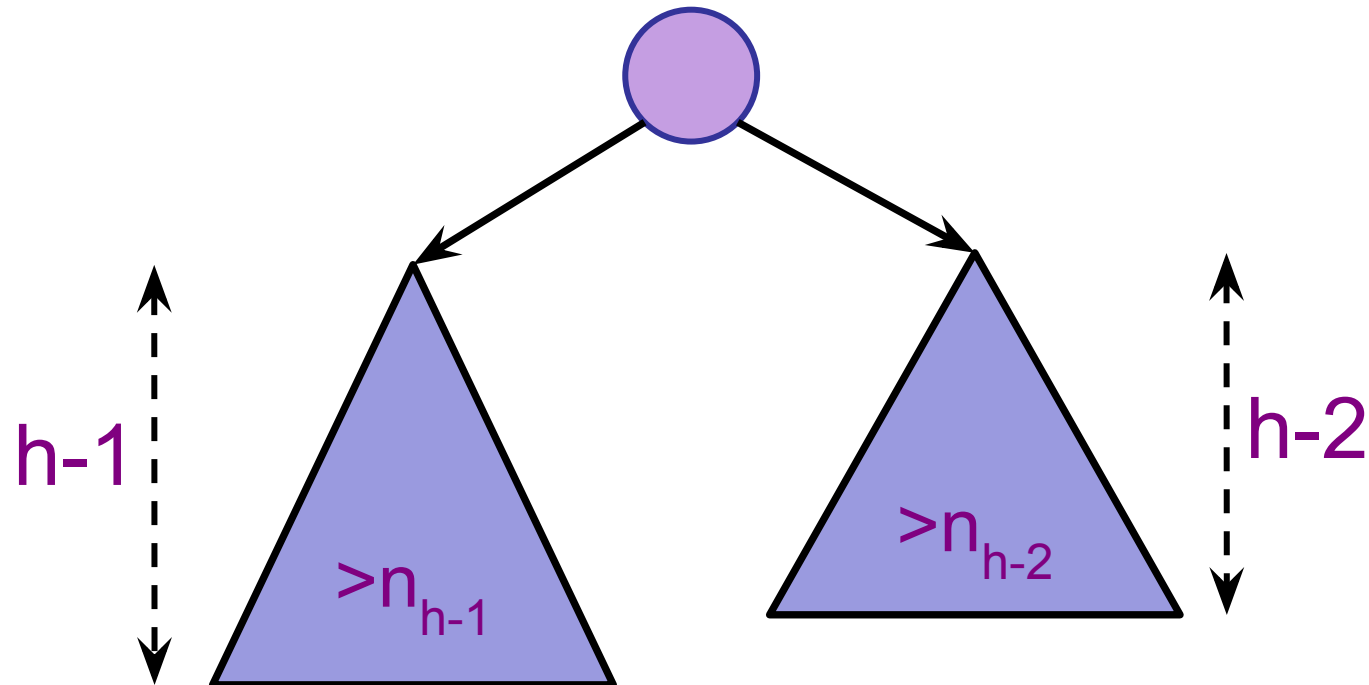
---

Proof:

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$$n_h \geq 1 + n_{h-1} + n_{h-2}$$

$$\geq 2n_{h-2}$$



# Height-Balanced Trees

---

Proof:

Let  $n_h$  be the minimum number of nodes in a height-balanced tree of height  $h$ .

$$n_h \geq 1 + n_{h-1} + n_{h-2}$$

$$\geq 2n_{h-2}$$

$$\geq 4n_{h-4}$$

$$\geq 8n_{h-6}$$

$$\geq \dots$$



How  
many  
times?

Base case:

$$n_0 = 1$$

# Height-Balanced Trees

---

Proof:

Let  $n_h$  be the minimum number of nodes in a height-balanced tree of height  $h$ .

$$n_h \geq 1 + n_{h-1} + n_{h-2}$$

$$\geq 2^1 n_{h-2}$$

$$\geq 2^2 n_{h-4}$$

$$\geq 2^3 n_{h-6}$$

$$\geq \dots \geq 2^k n_0$$

What is  
 $k$ ?

Base case:

$$n_0 = 1$$

# Height-Balanced Trees

---

Proof:

Let  $n_h$  be the minimum number of nodes in a height-balanced tree of height  $h$ .

$$n_h \geq 1 + n_{h-1} + n_{h-2}$$

$$\geq 2n_{h-2}$$

$$\geq 2^{h/2} n_0$$

$$\geq 2^{h/2}$$

Base case:

$$n_0 = 1$$

# Height-Balanced Trees

---

Claim:

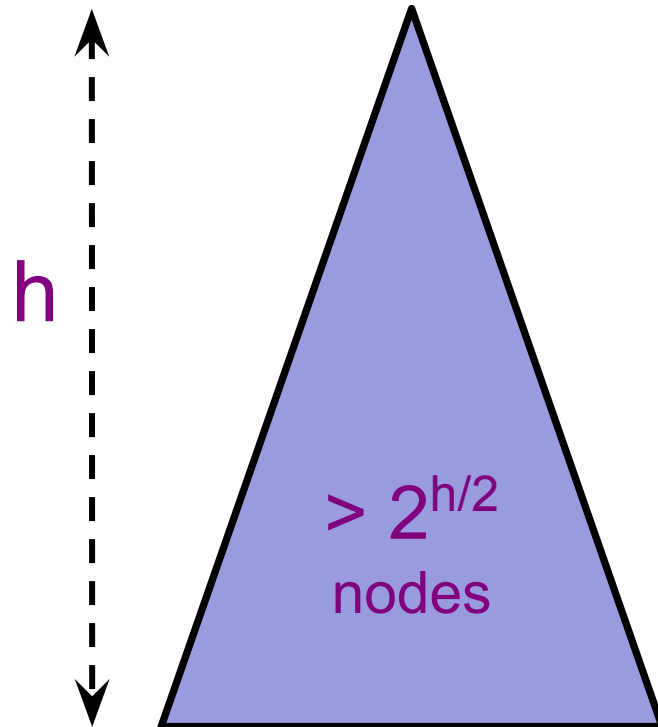
A height-balanced tree with  $n$  nodes has height  $h < 2\log(n)$ .

Show:

$$n_h > 2^{h/2}$$



$$h < 2\log(n_h)$$



# Height-Balanced Trees

---

Claim:

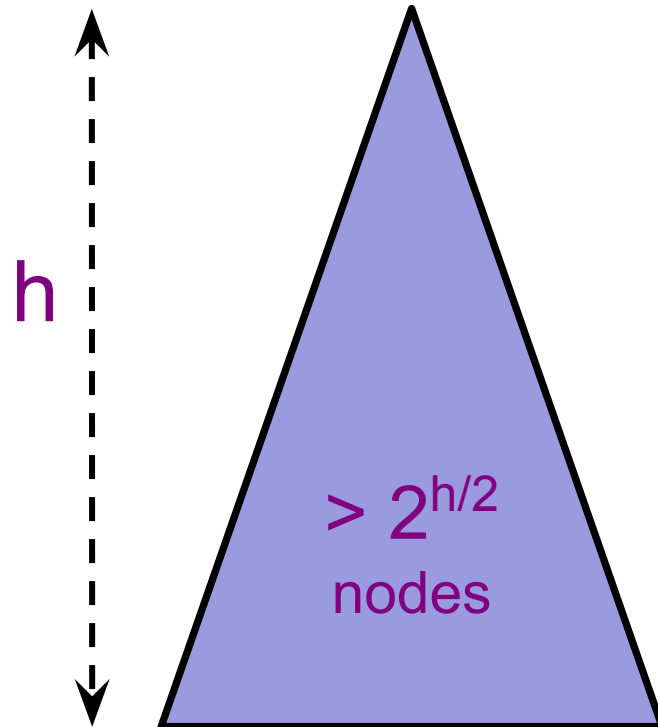
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# Height-Balanced Trees

---

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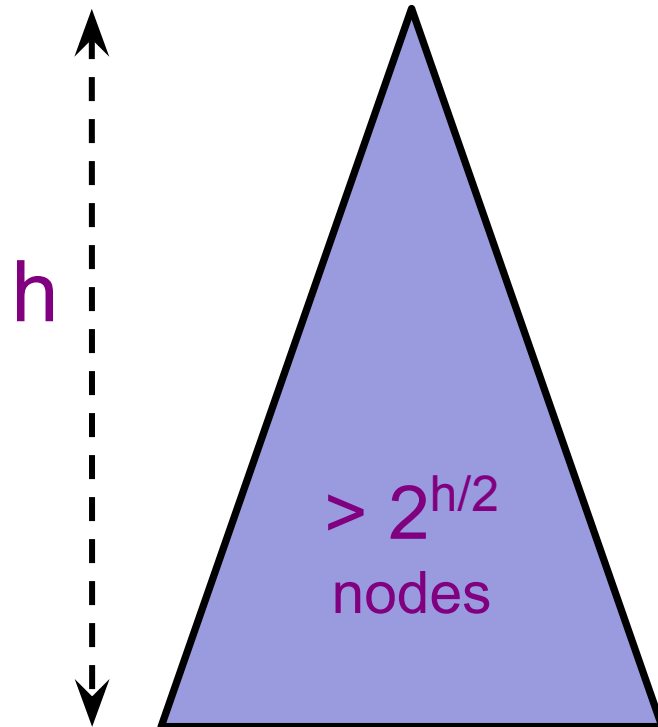
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Show:

$$n_h > 2^{h/2}$$



$$h < 2\log(n_h)$$



# Height-Balanced Trees

---

Claim:

A height-balanced tree with  $n$  nodes has height  $h < 2\log(n)$ .

Show:

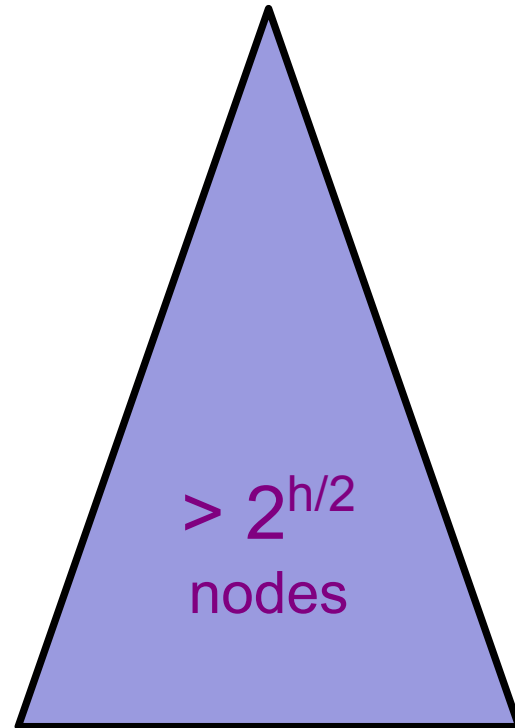
Is this constant tight?

$$n_h > 2^{h/2}$$



$$h < 2\log(n_h)$$

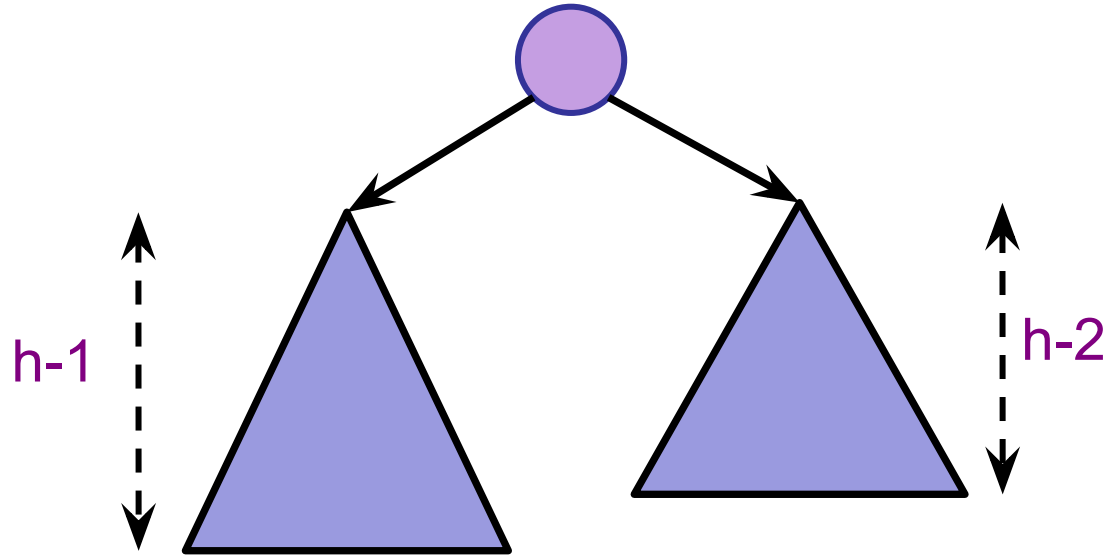
$h$





# Height-Balanced Trees

---



Show (induction):

$F_n = n^{\text{th}}$  Fibonacci number

$n_h = F_{h+2} - 1 \cong \varphi^{h+1} / \sqrt{5} - 1$  (rounded to nearest int)

$h \cong \log(n) / \log(\varphi)$        $\varphi \cong 1.618$

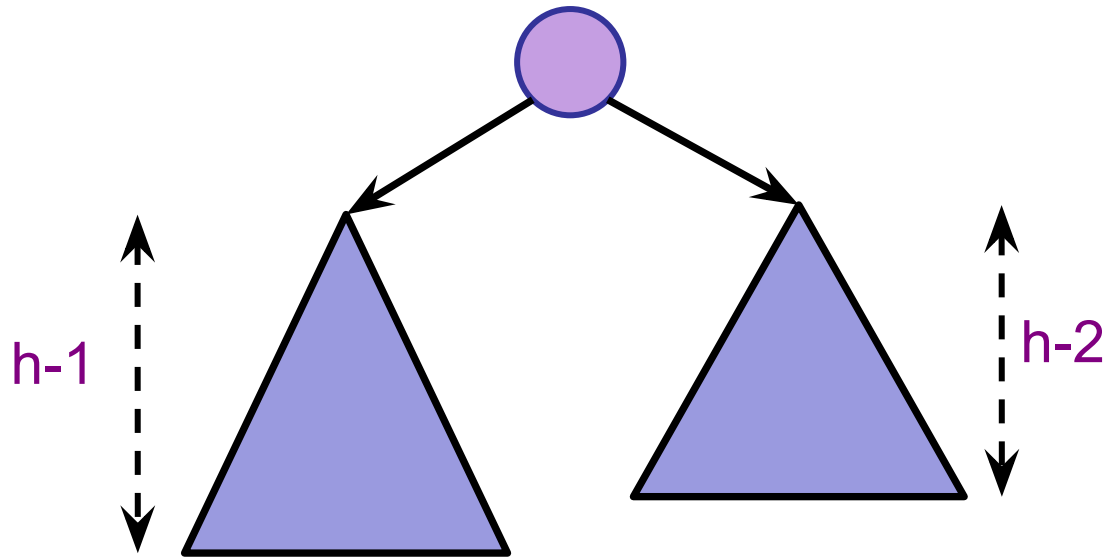
$h \cong 1.44 \log(n)$

# Height-Balanced Trees

---

Claim:

A height-balanced tree is balanced, i.e., has height  $h = O(\log n)$ .



# AVL Trees [Adelson-Velskii & Landis 1962]

---

Step 0: Augment

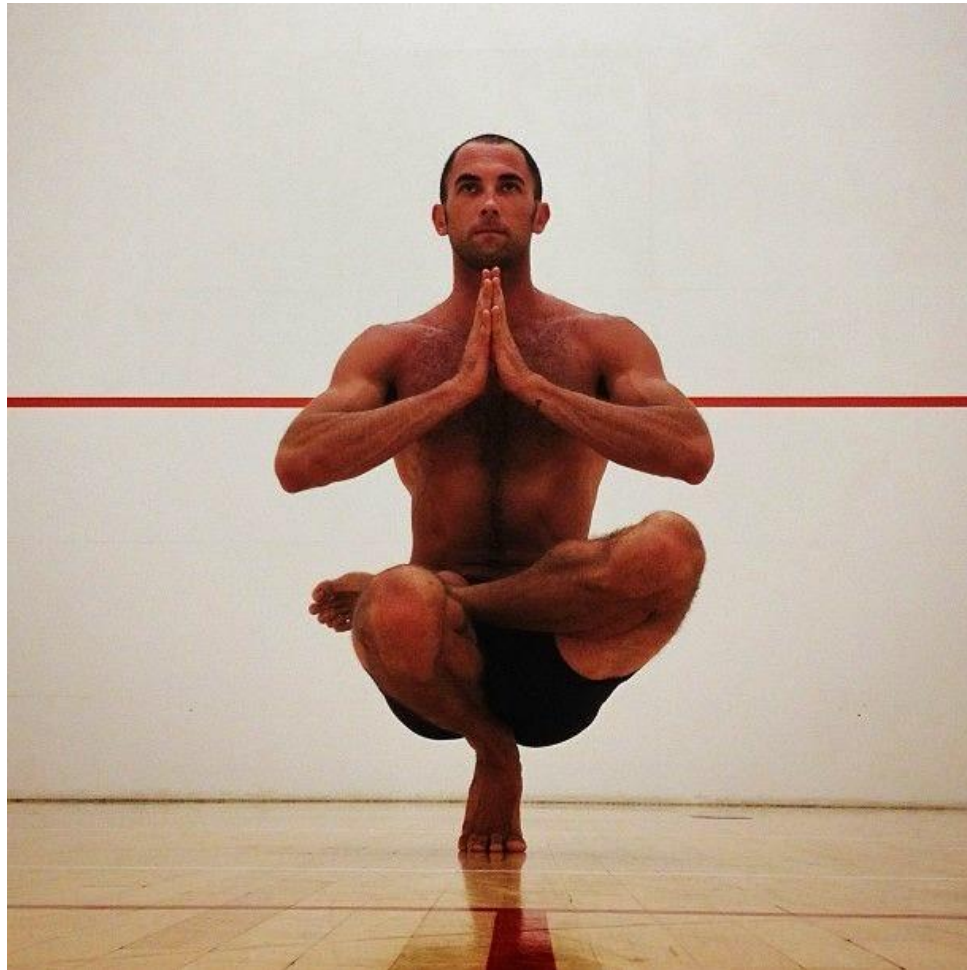
Step 1: Define Height Balance

Step 2: Maintain Balance 

# It's good that we don't have to

---

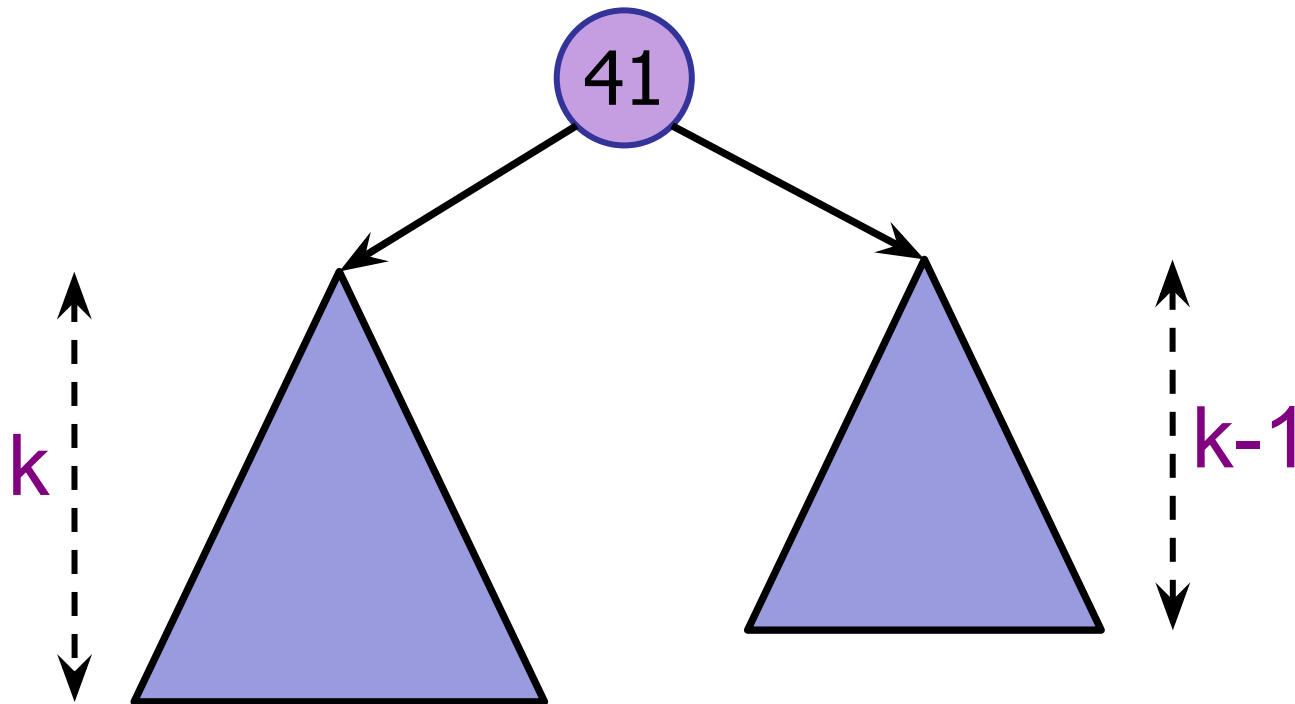
Balance perfectly



# AVL Trees [Adelson-Velskii & Landis 1962]

---

Step 2: Show how to maintain height-balance



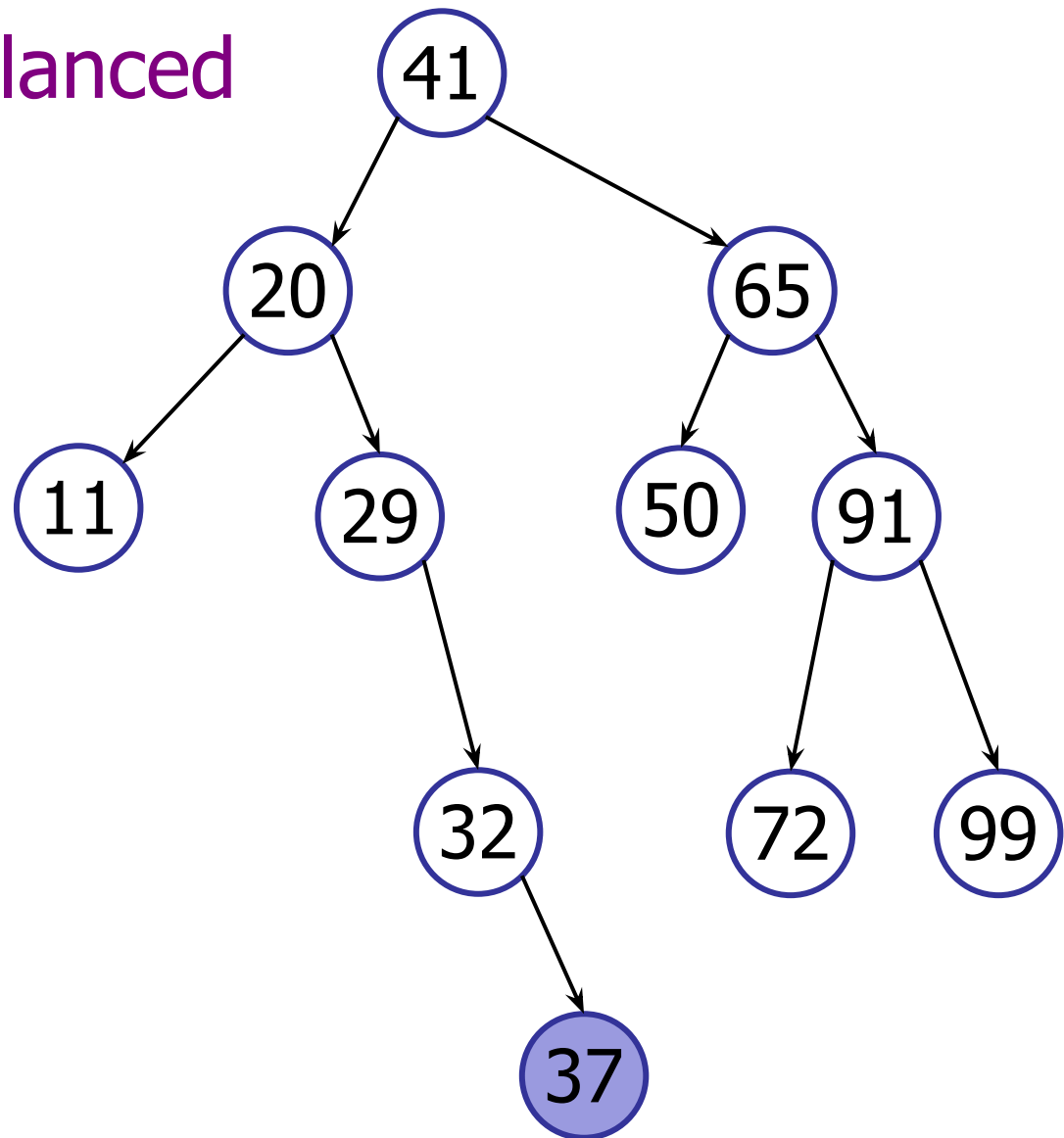
# Inserting in an AVL Tree

---

Before insertion, balanced  
`insert(37)`

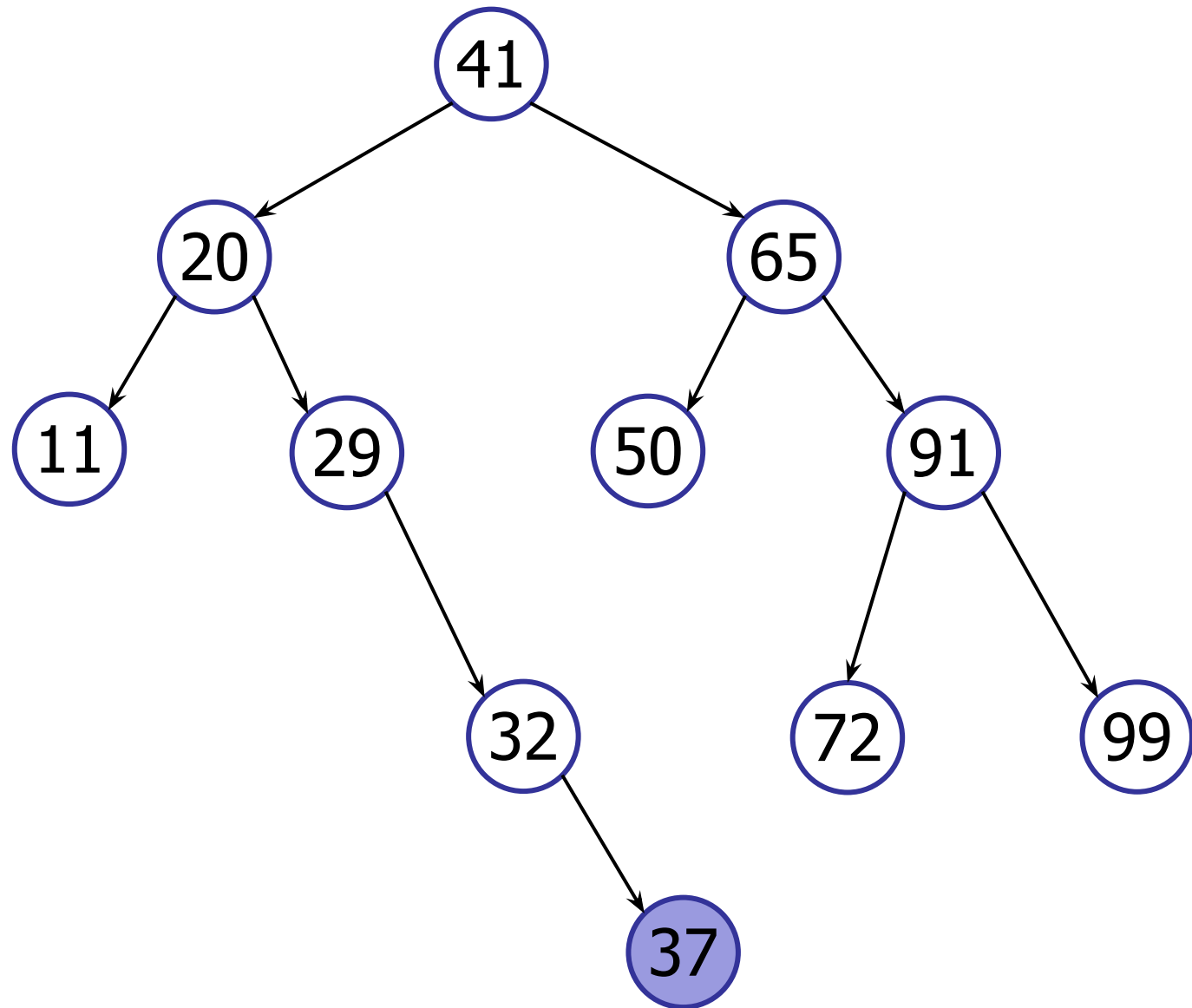
No longer balanced  
after insertion!

Need to rebalance!



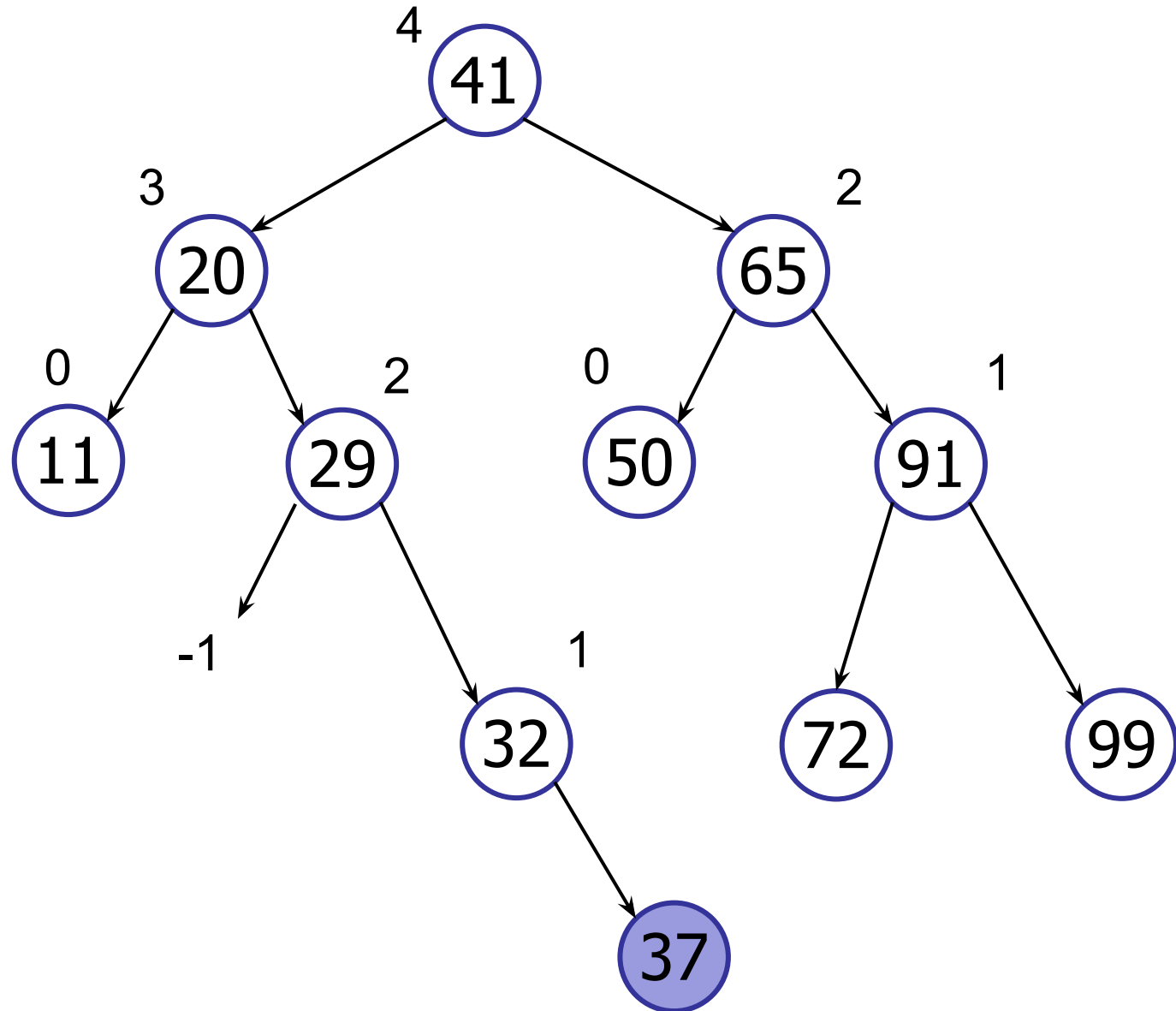
# Which nodes need rebalancing?

1. 41
2. 20
3. 11
4. 29
5. 32
6. 37
7. 65



Which nodes need rebalancing?

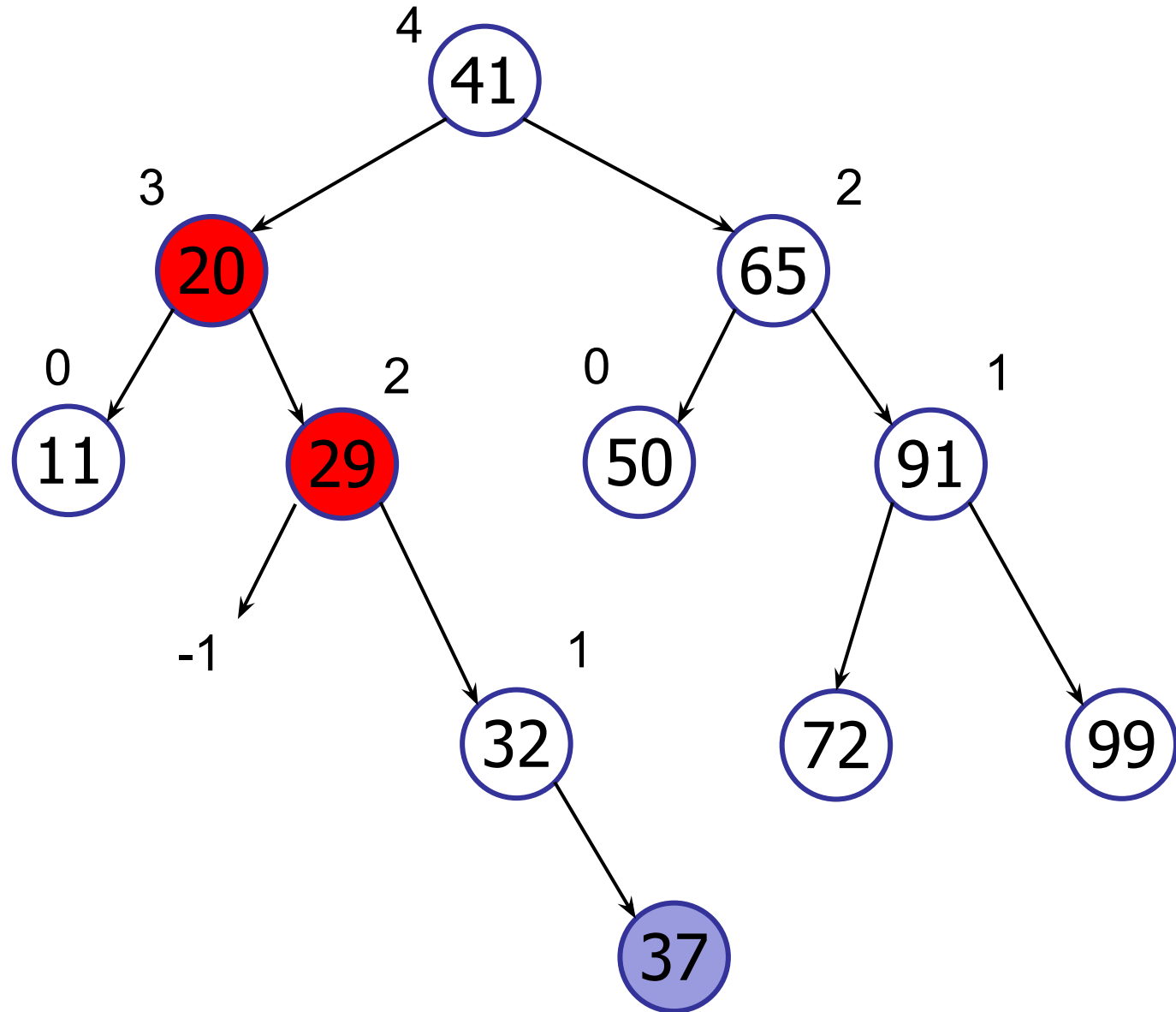
1. 41
2. 20
3. 11
4. 29
5. 32
6. 37
7. 65





# Which nodes need rebalancing?

1. 41
- ✓ 2. 20
3. 11
- ✓ 4. 29
5. 32
6. 37
7. 65

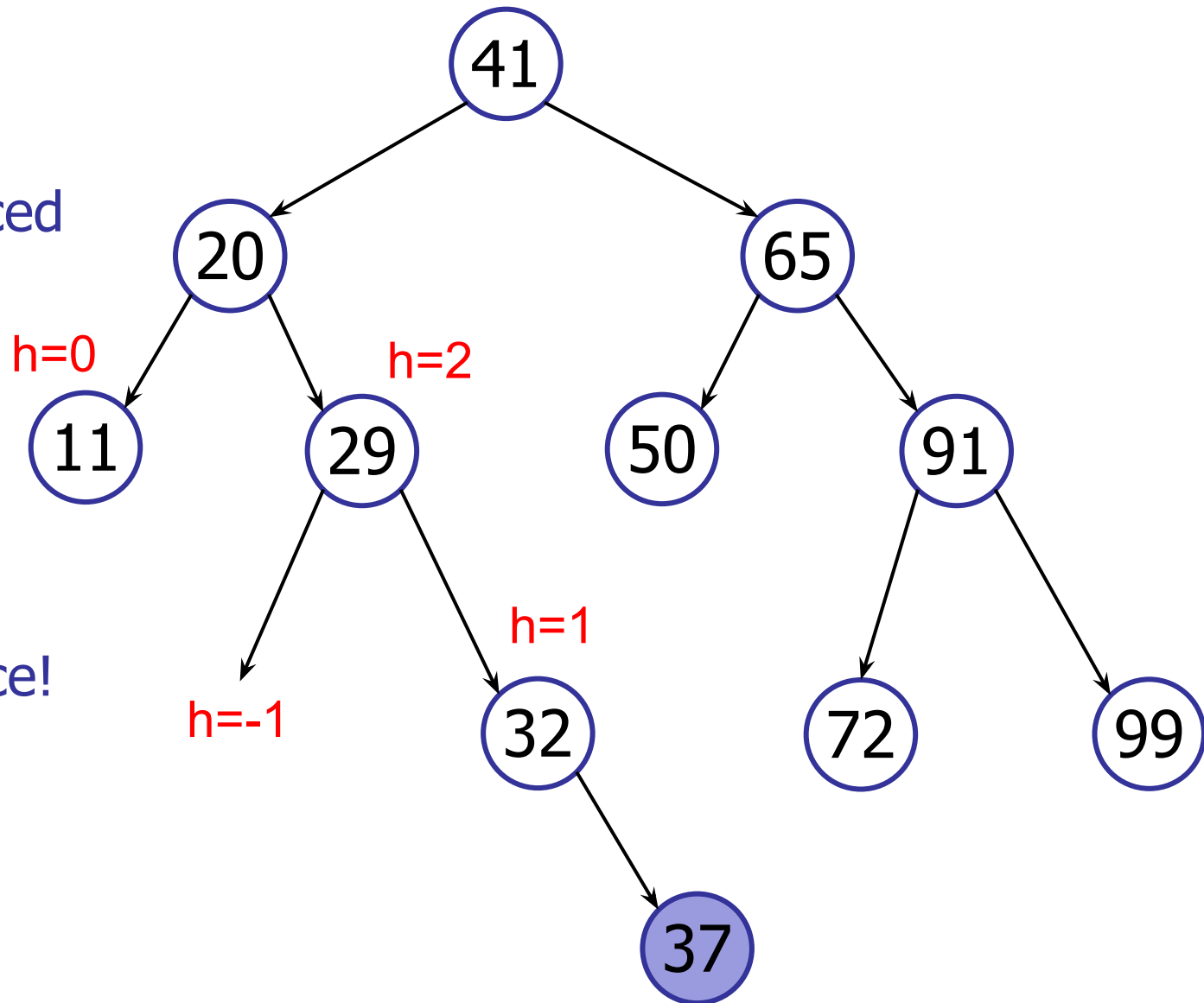


# Inserting in an AVL Tree

insert(37)

No longer balanced  
after insertion!

Need to rebalance!



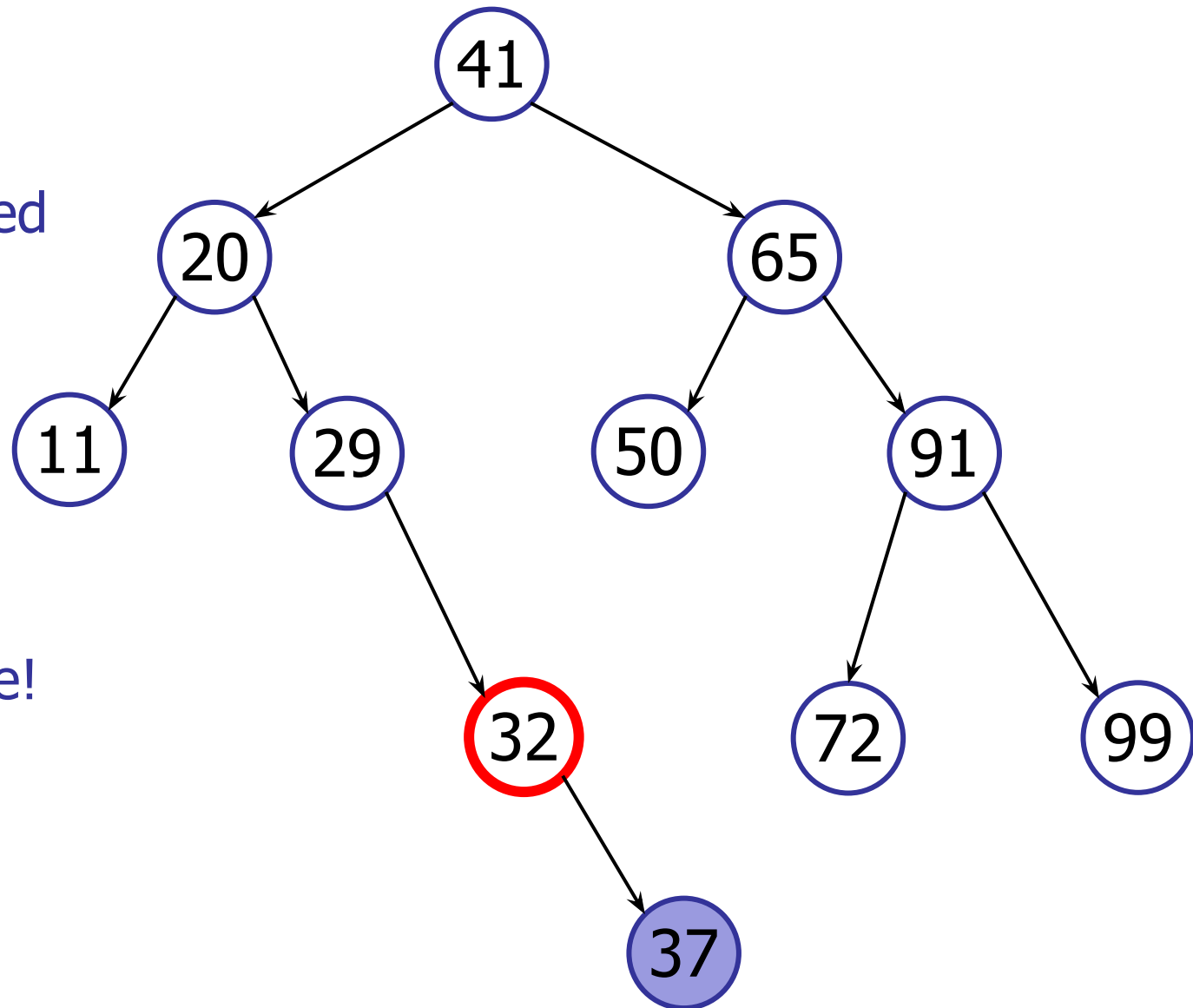
# Inserting in an AVL Tree

---

insert(37)

No longer balanced  
after insertion!

Need to rebalance!



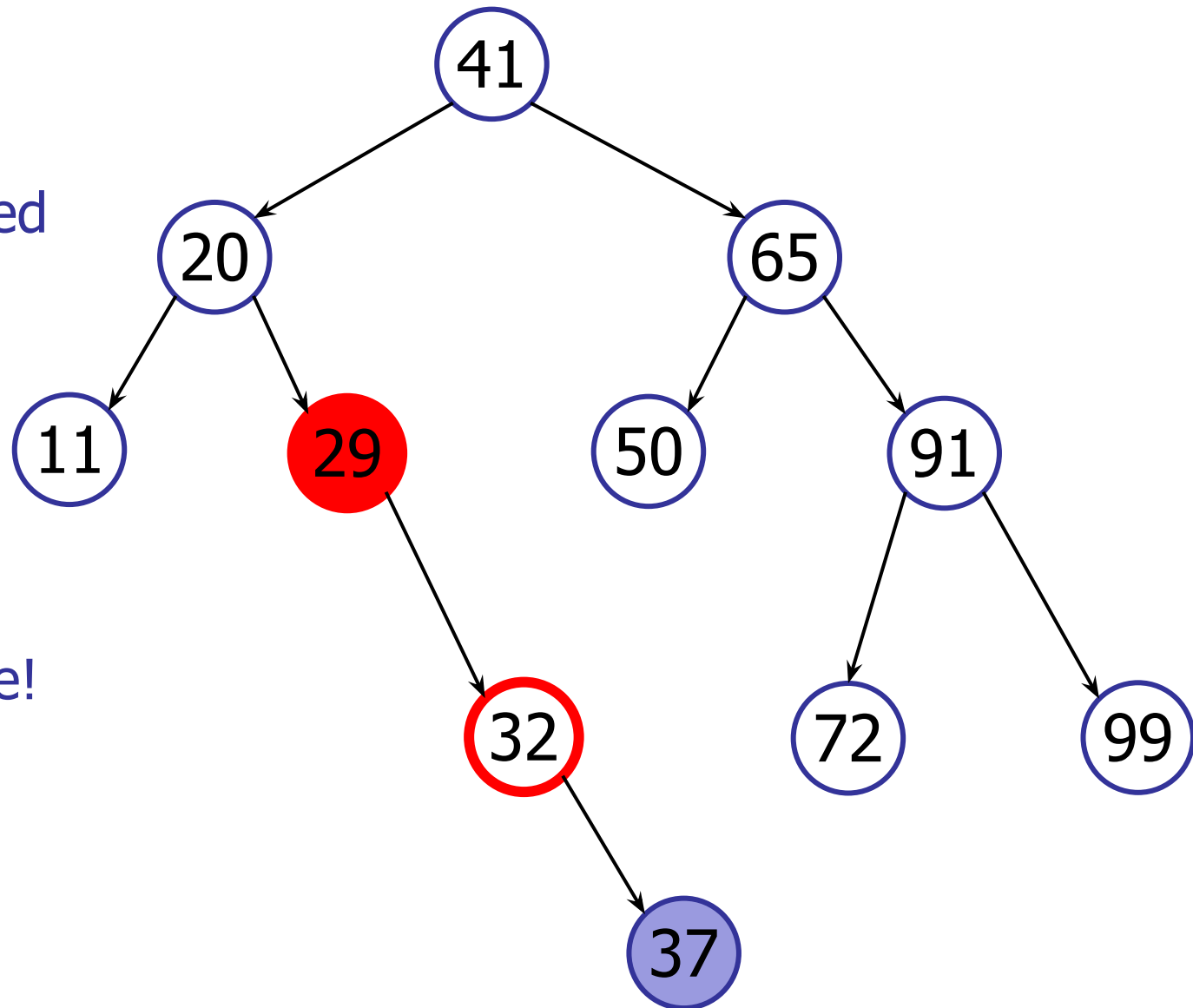
# Inserting in an AVL Tree

---

insert(37)

No longer balanced  
after insertion!

Need to rebalance!



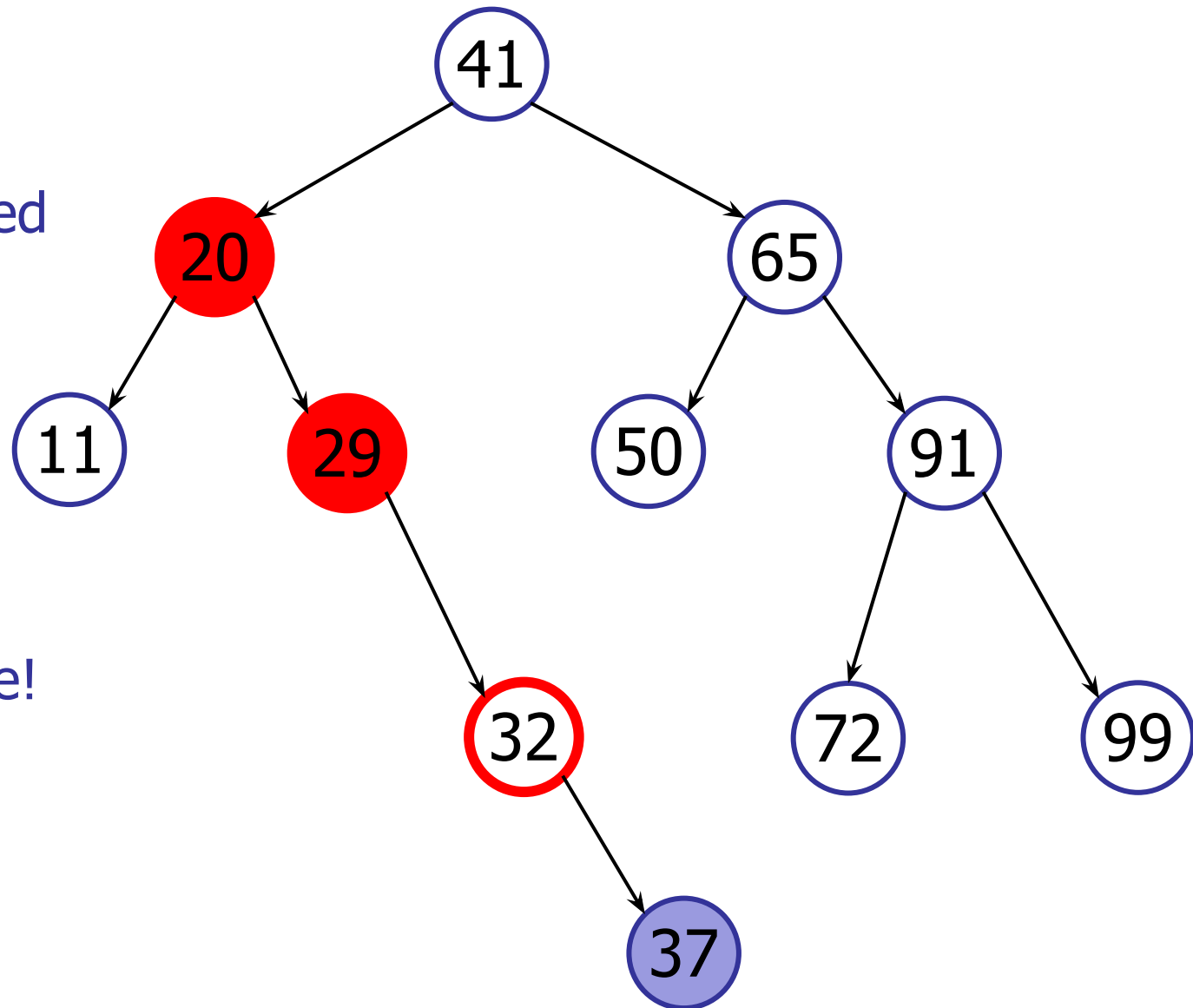
# Inserting in an AVL Tree

---

insert(37)

No longer balanced  
after insertion!

Need to rebalance!



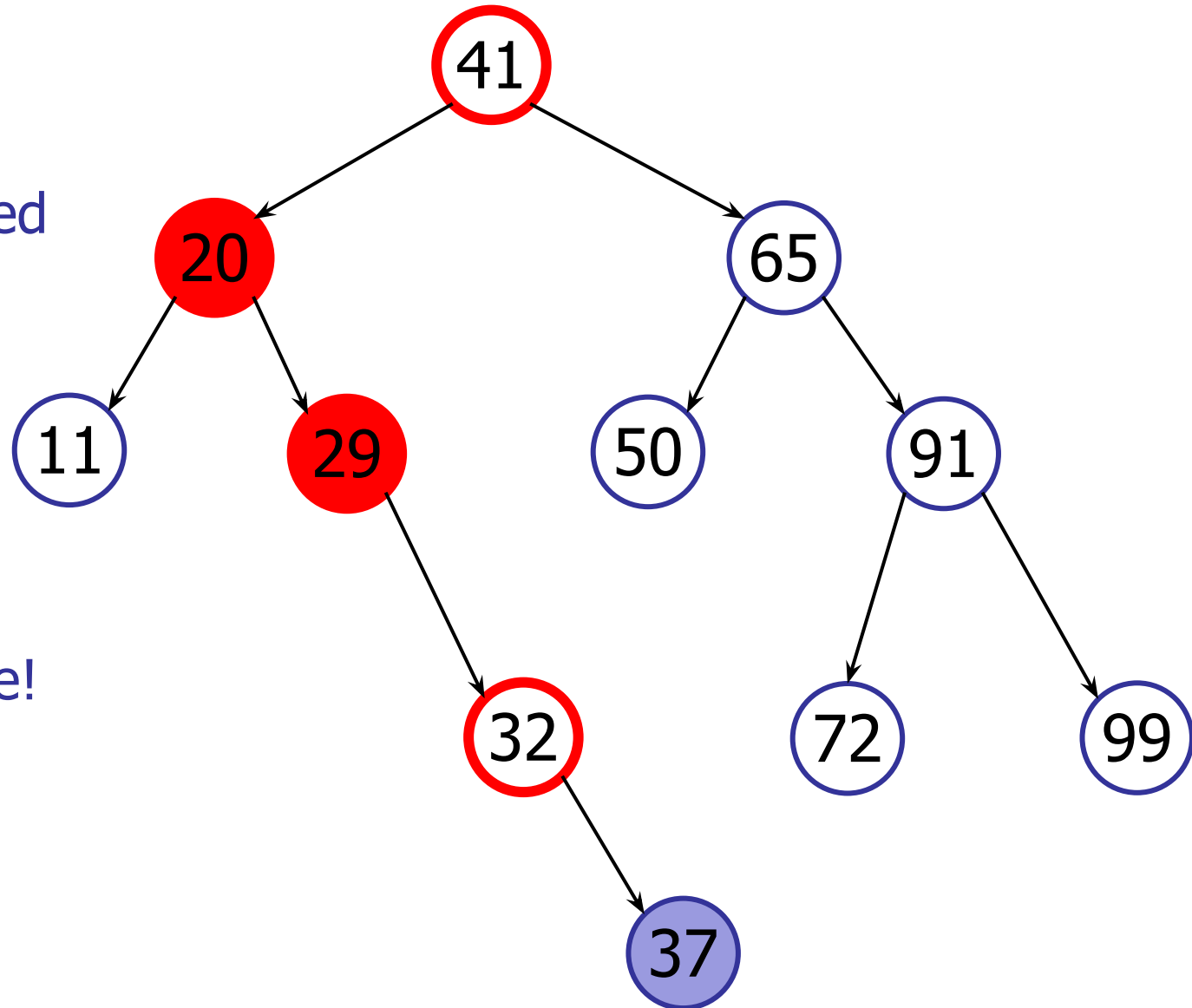
# Inserting in an AVL Tree

---

insert(37)

No longer balanced  
after insertion!

Need to rebalance!

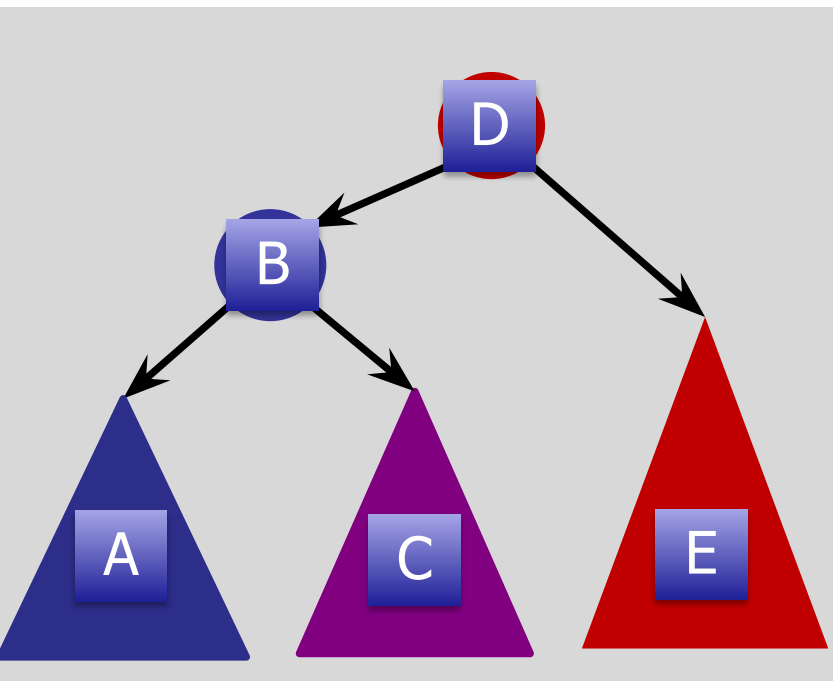


# Trick to rebalance the tree

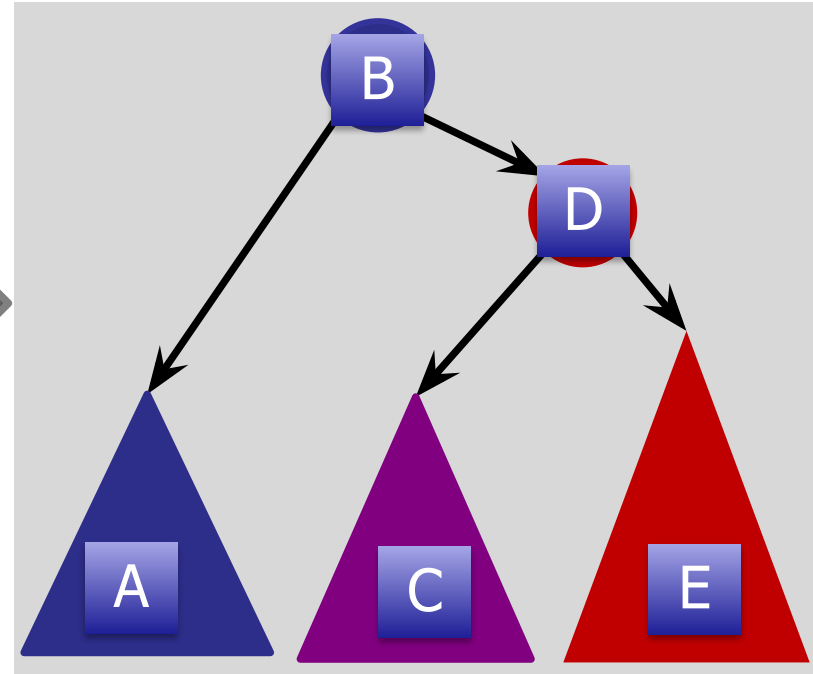
---

Tree rotation!

# Tree Rotations



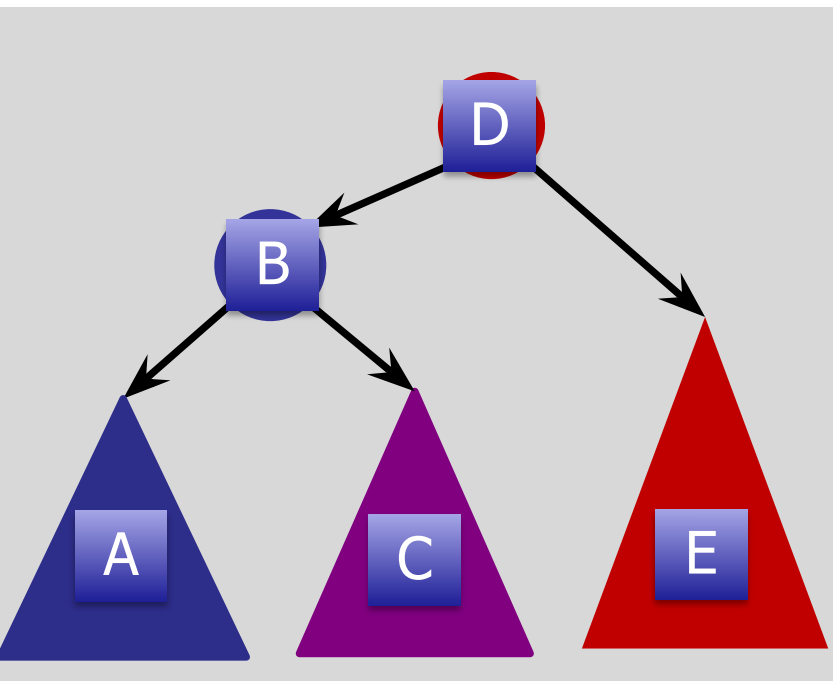
Right  
Rotation



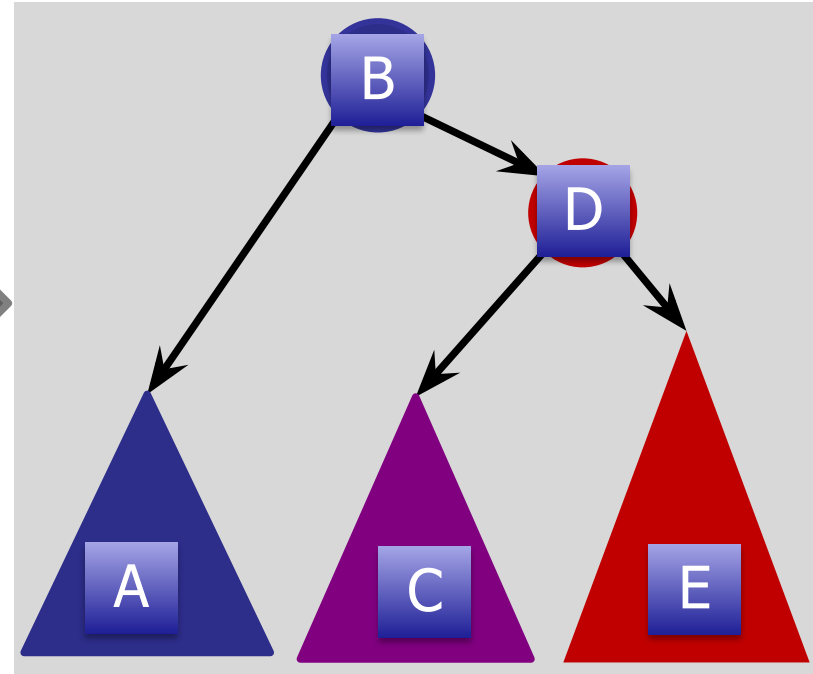
$A < B < C < D < E$



# Tree Rotations



Right  
Rotation

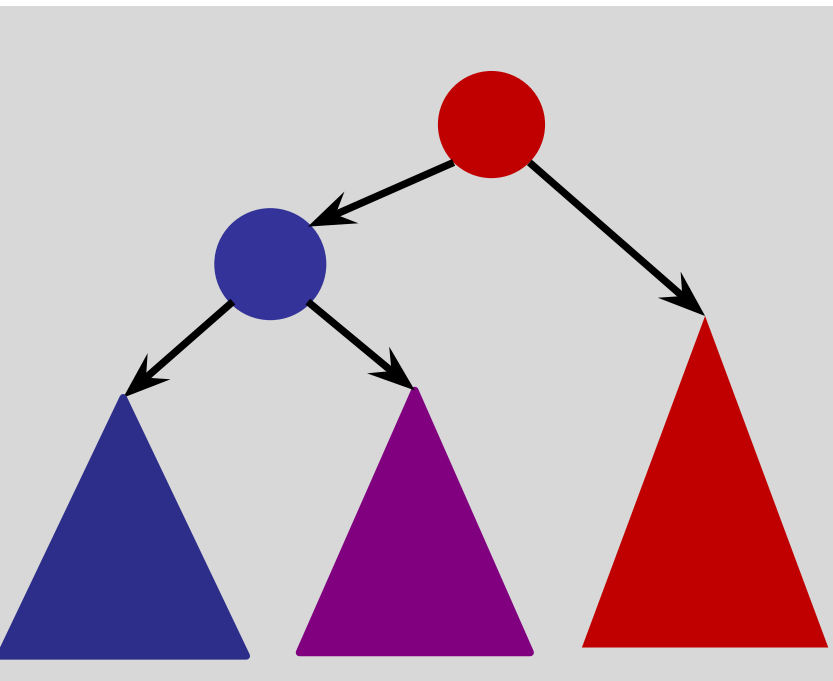


$A < B < C < D < E$

Rotations maintain ordering of keys.

⇒ Maintains BST property.

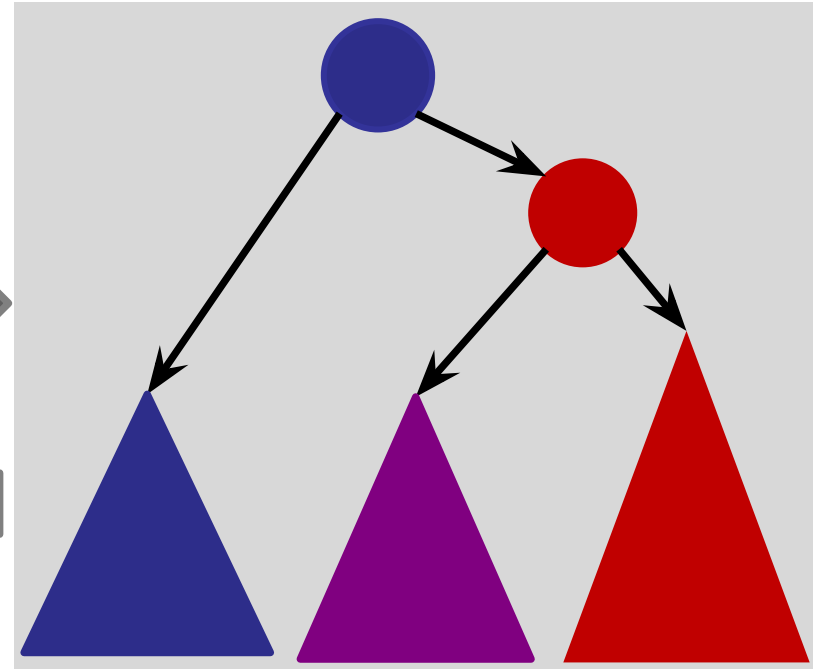
# Tree Rotations



Right  
Rotation



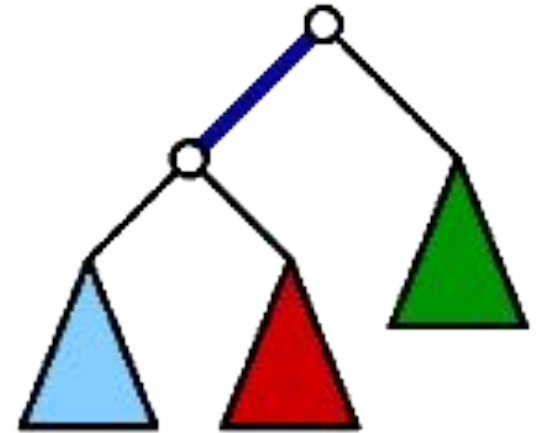
Left  
Rotation



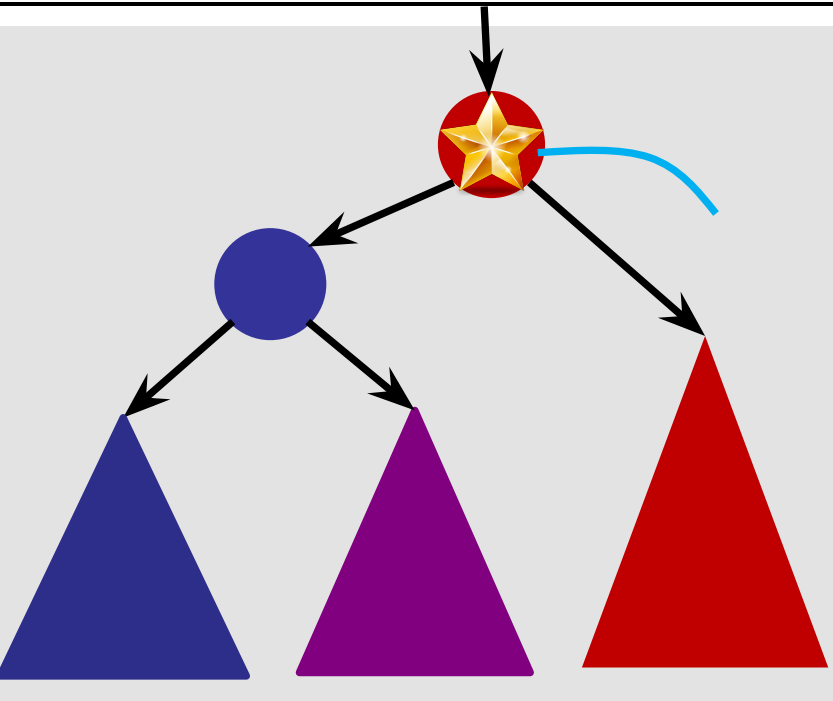
# Wait....

---

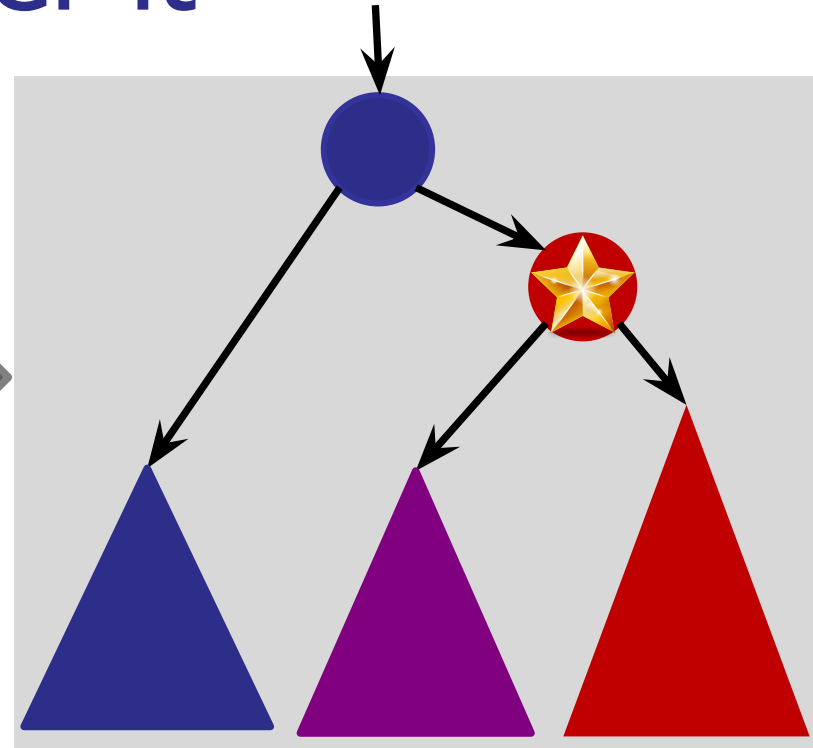
What is a left rotation and what is a right rotation!?



# The way to remember it

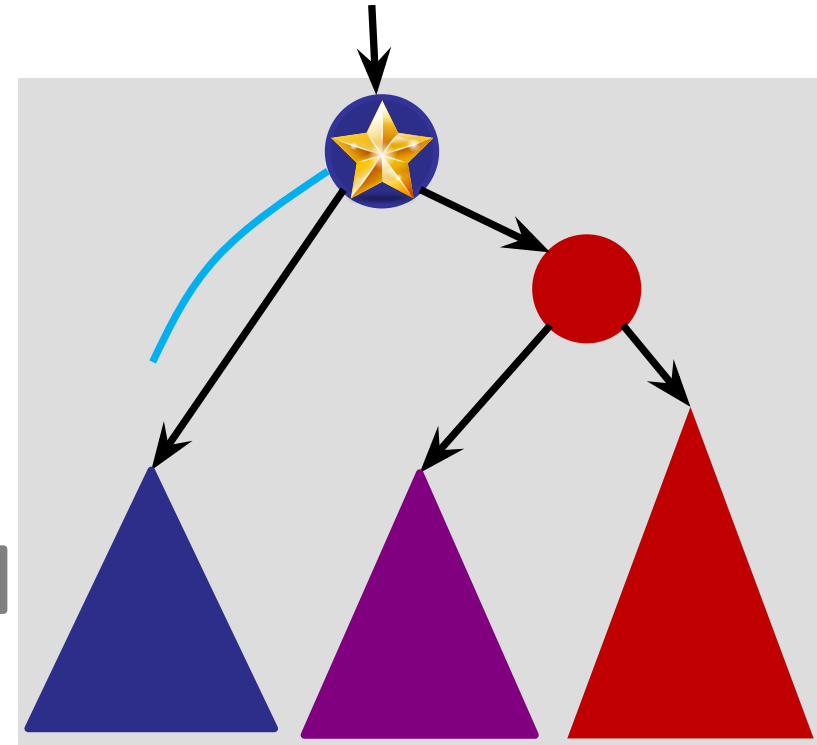
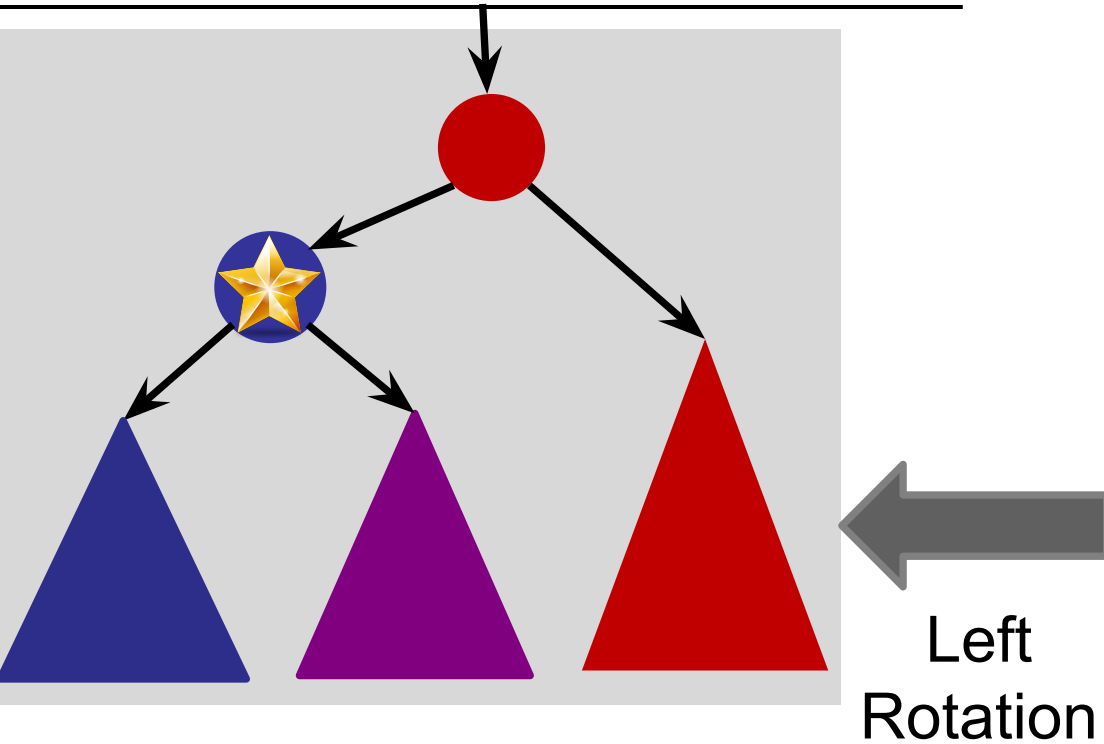


Right  
Rotation



The root of the subtree moves right

# Tree Rotations



The root of the subtree moves left

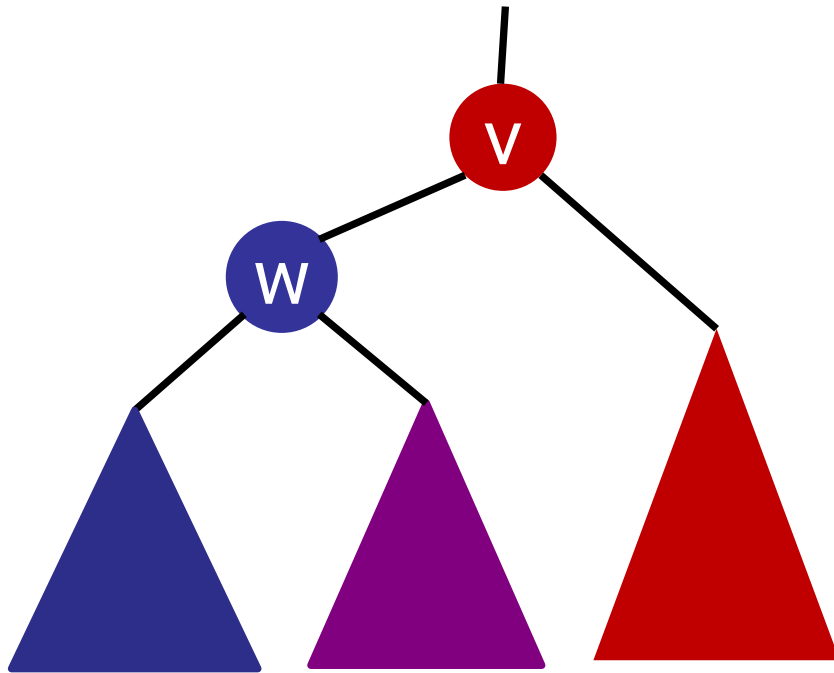
# Rotations

---

right-rotate(v)

// assume v has left != null

w = v.left



# Rotations

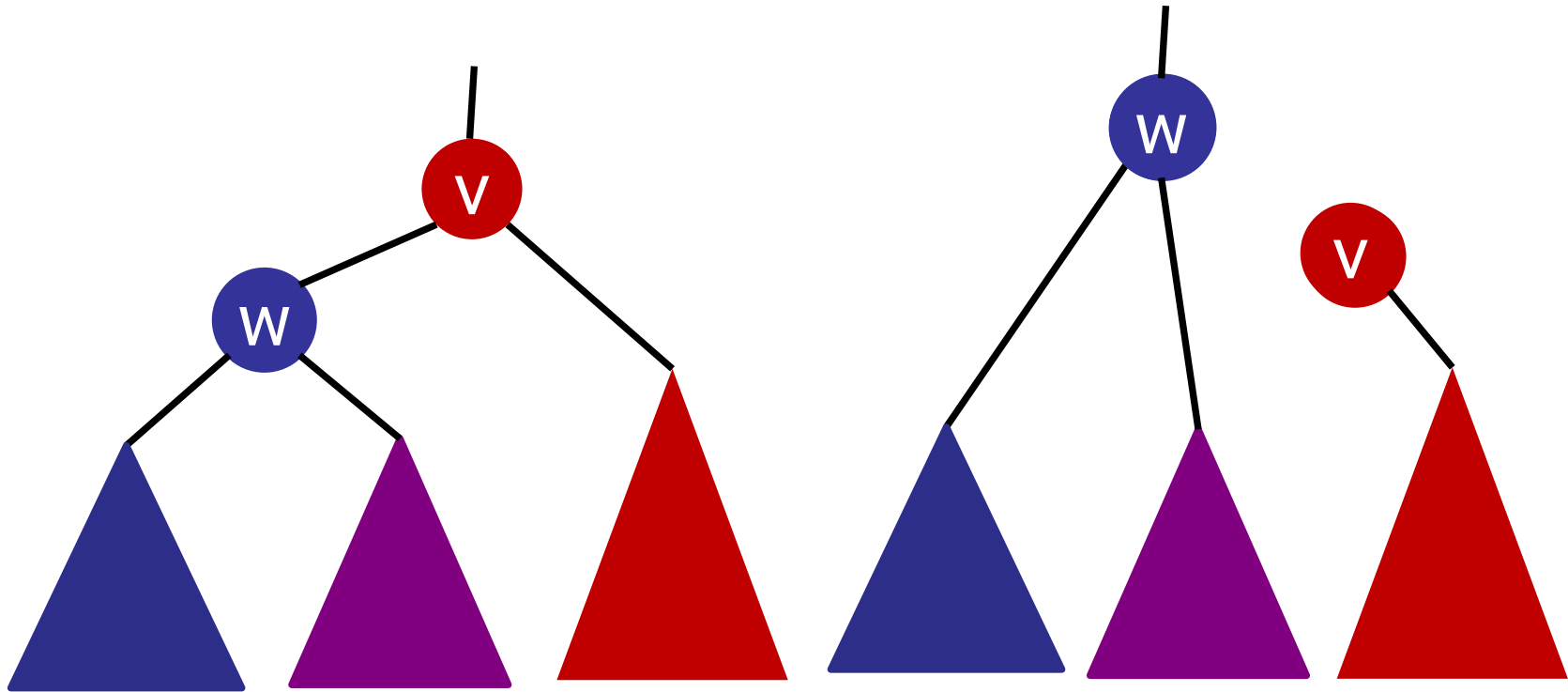
---

right-rotate(v)

// assume v has left != null

w = v.left

w.parent = v.parent



# Rotations

---

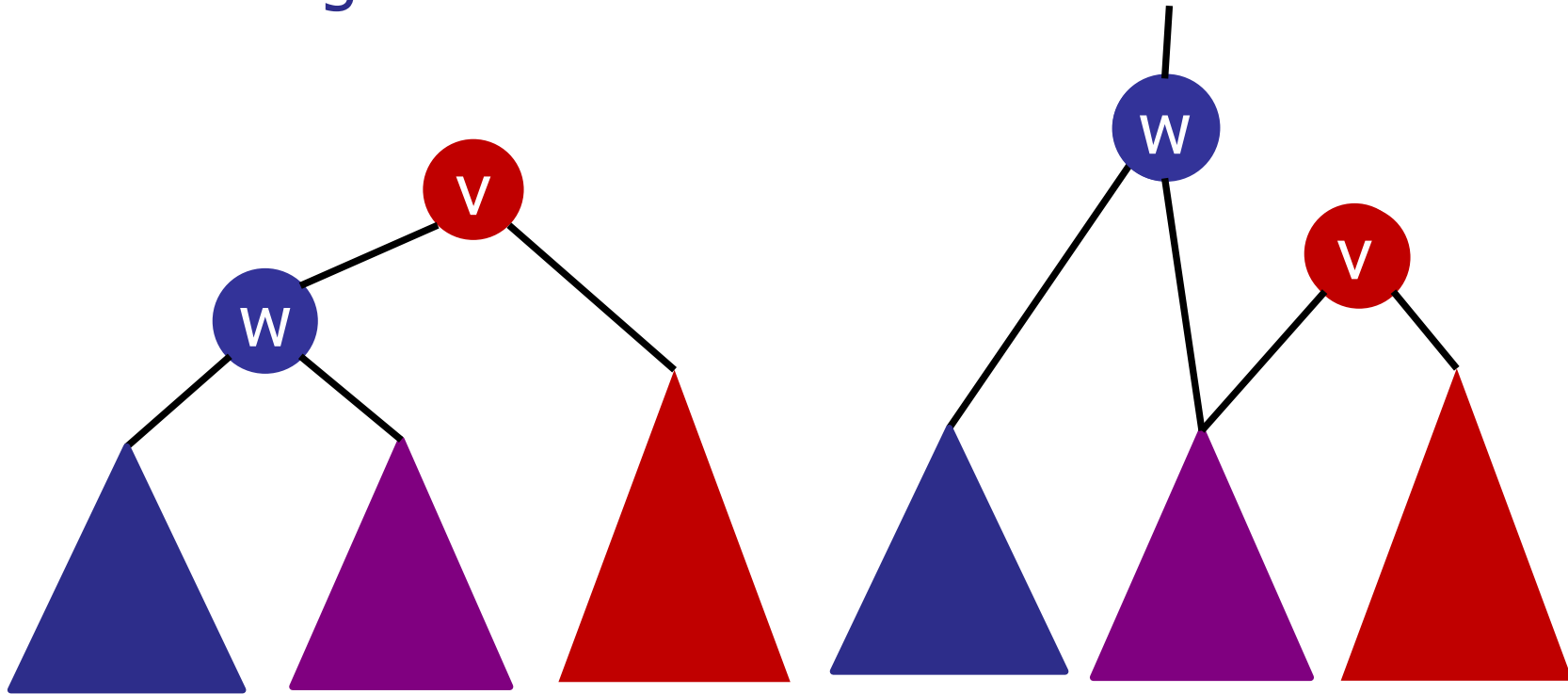
right-rotate(v)

// assume v has left != null

w = v.left

w.parent = v.parent

v.left = w.right





# Rotations

---

right-rotate(v)

// assume v has left != null

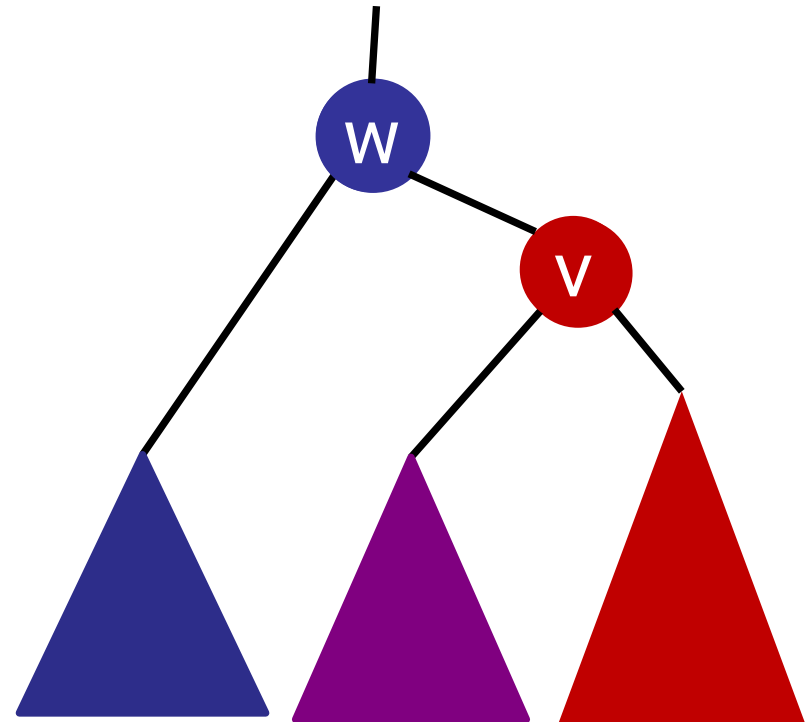
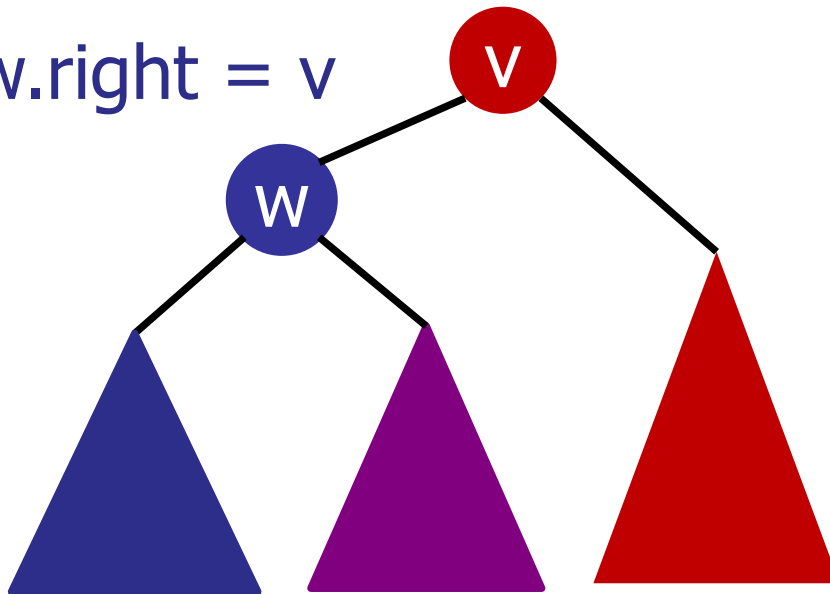
w = v.left

w.parent = v.parent

v.left = w.right

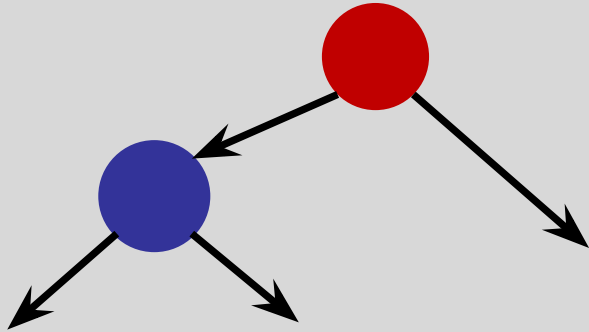
v.parent = w

w.right = v

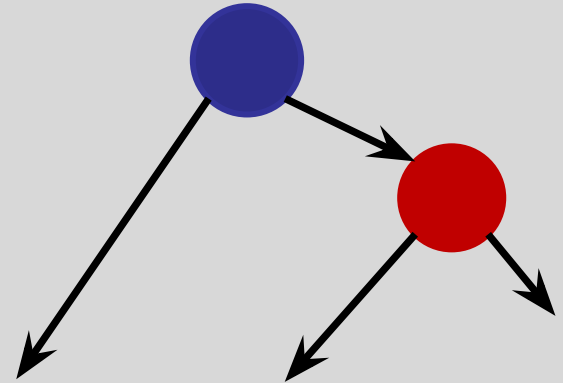


# Tree Rotations

---

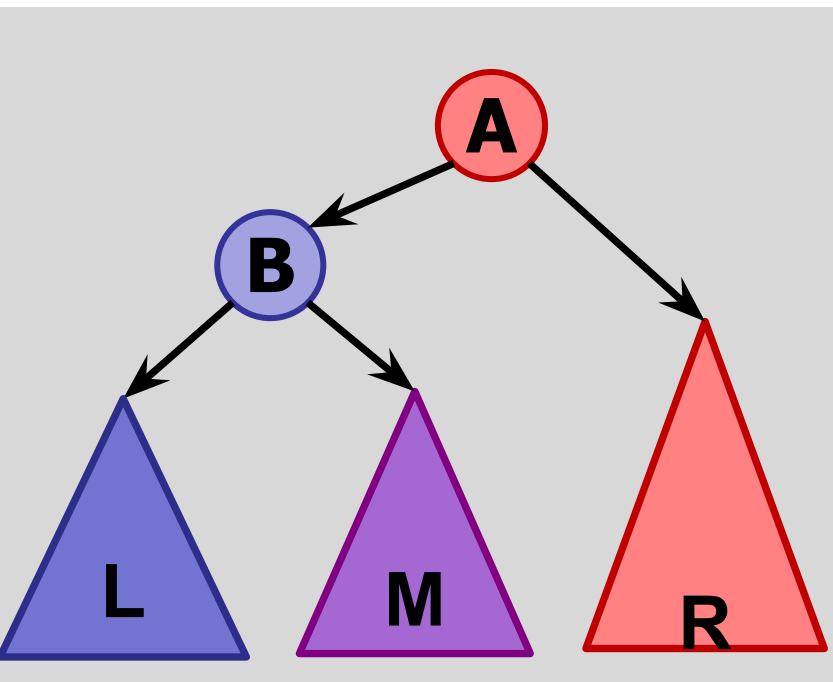


Right  
Rotation

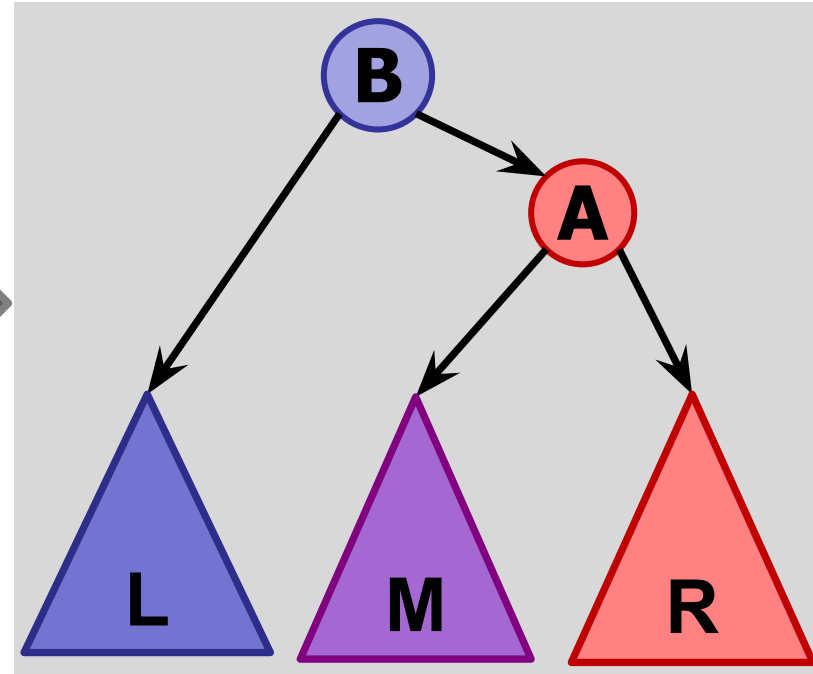


rotate-right requires a left child  
rotate-left requires a right child

# Tree Rotations



Right  
Rotation



After insert:

Use tree rotations to restore balance.

Height is out-of-balance by 1

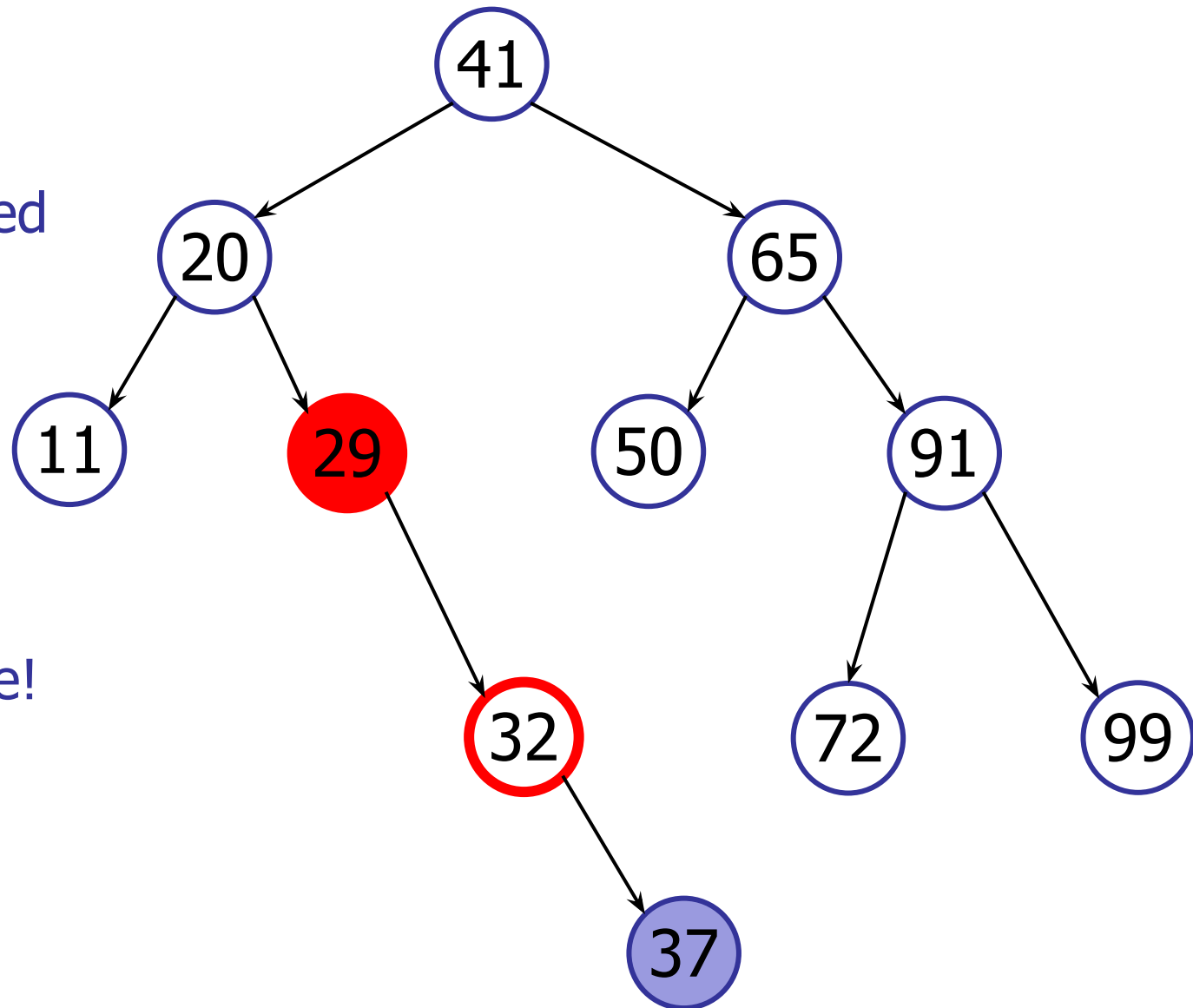
# Inserting in an AVL Tree

---

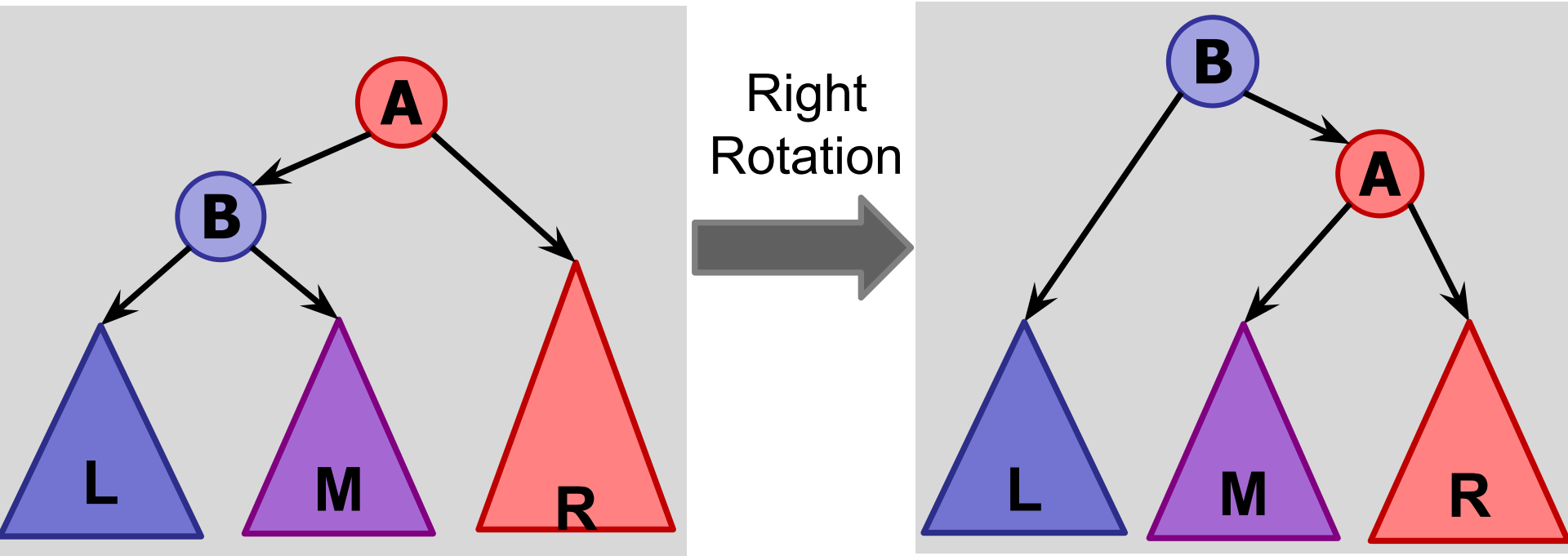
insert(37)

No longer balanced  
after insertion!

Need to rebalance!



# Tree Rotations

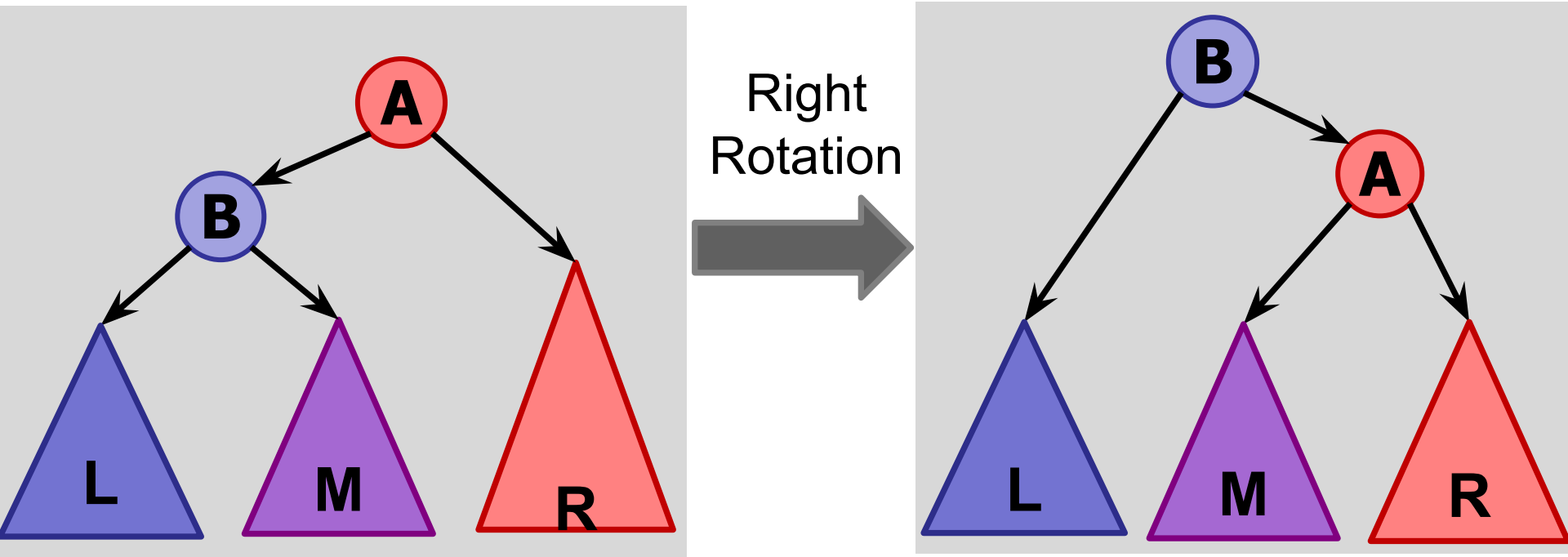


Use tree rotations to restore balance.

After insert, start at bottom, work your way up.

Assume subtree rooted at **A** is **LEFT-heavy**.

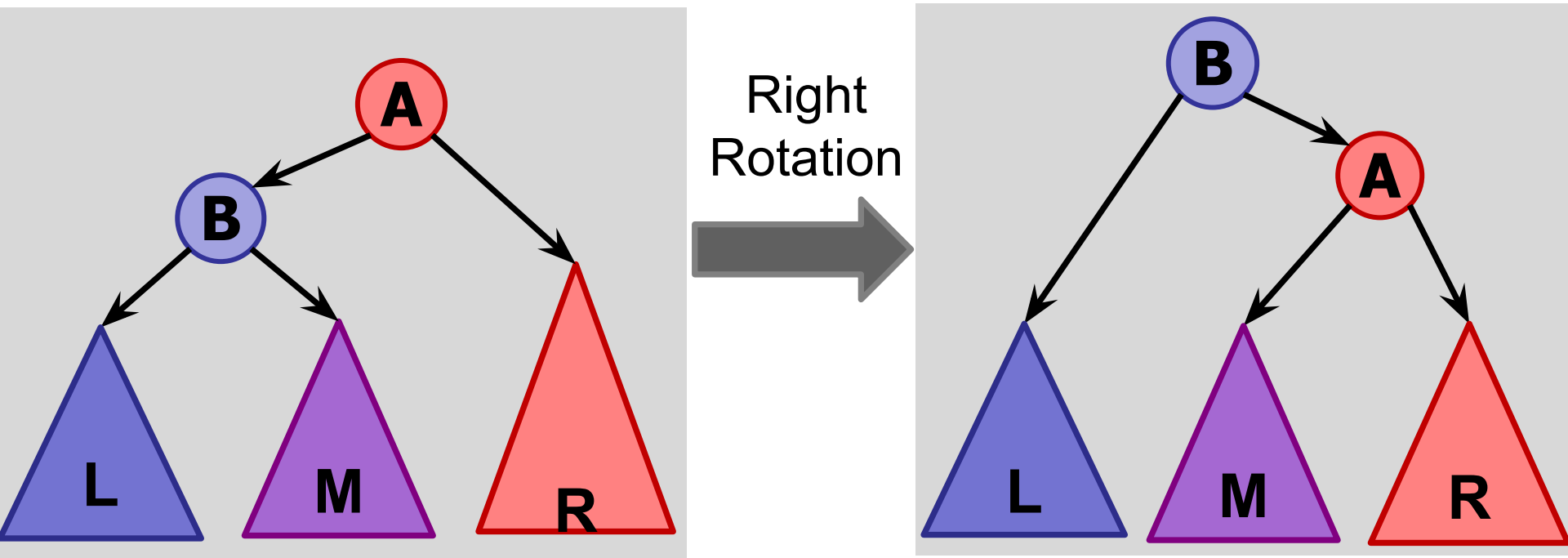
# Tree Rotations



Assume subtree rooted at A is **LEFT-heavy**.

Left-heavy: Left subtree is taller than right subtree

# Tree Rotations

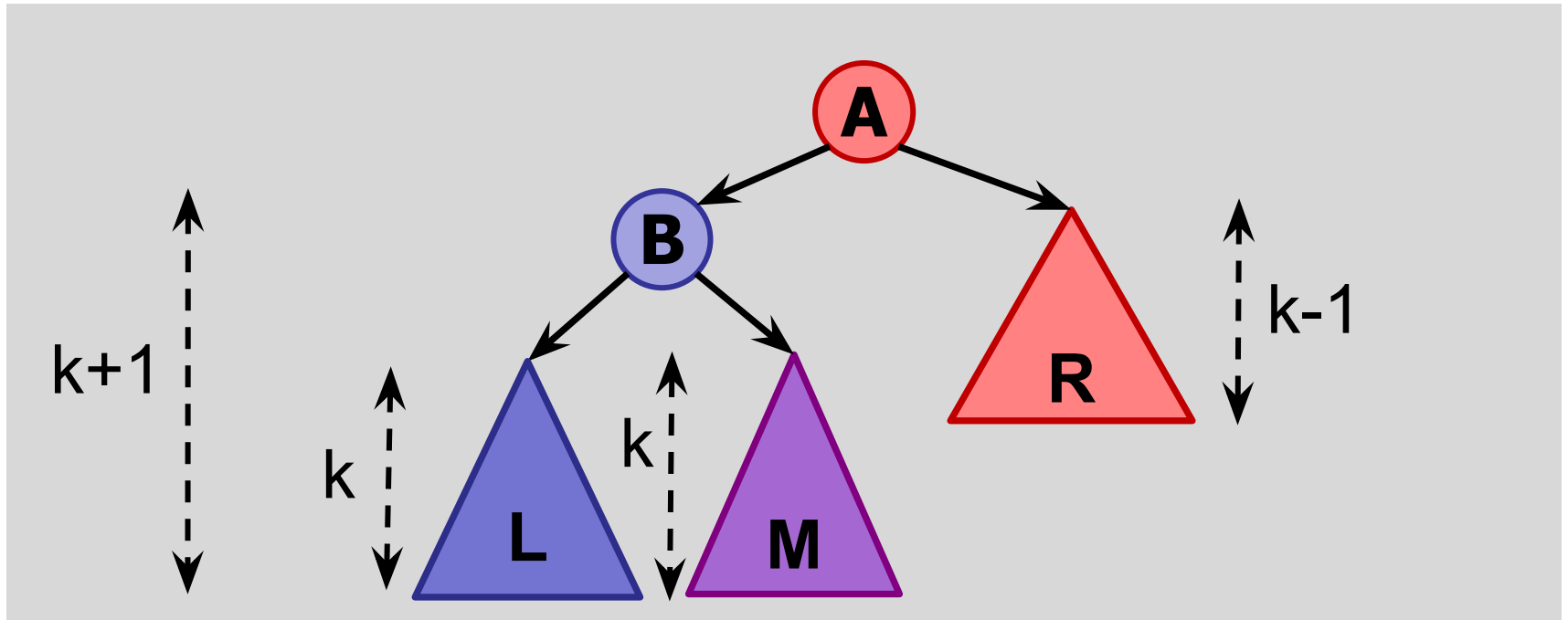


Assume subtree rooted at **A** is **LEFT-heavy**.

Left-heavy: Left subtree is taller than right subtree

3 cases: B is left-heavy, B is balanced, B is right-heavy

# Tree Rotations (Left Heavy)



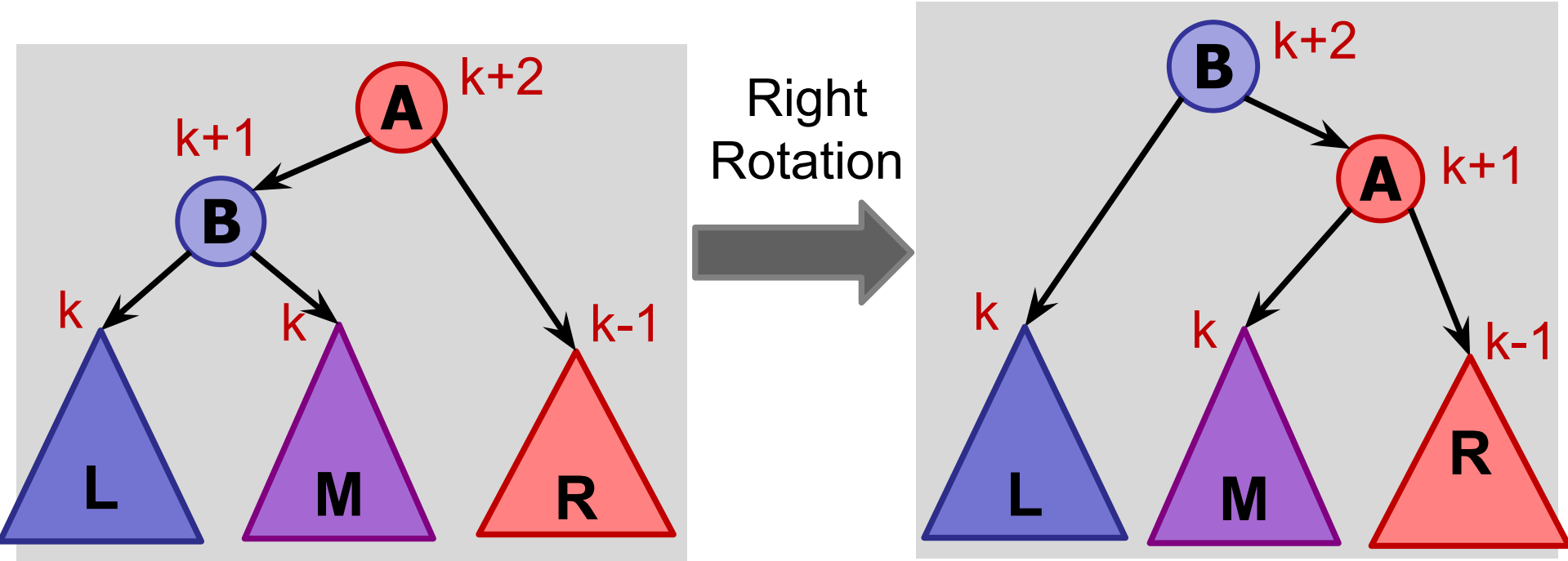
Assume **A** is the lowest node in the tree violating balance property.

Case 1: **B** is balanced :  $h(\text{L}) = h(\text{M})$

$$h(\text{R}) = h(\text{M}) - 1$$



# Tree Rotations

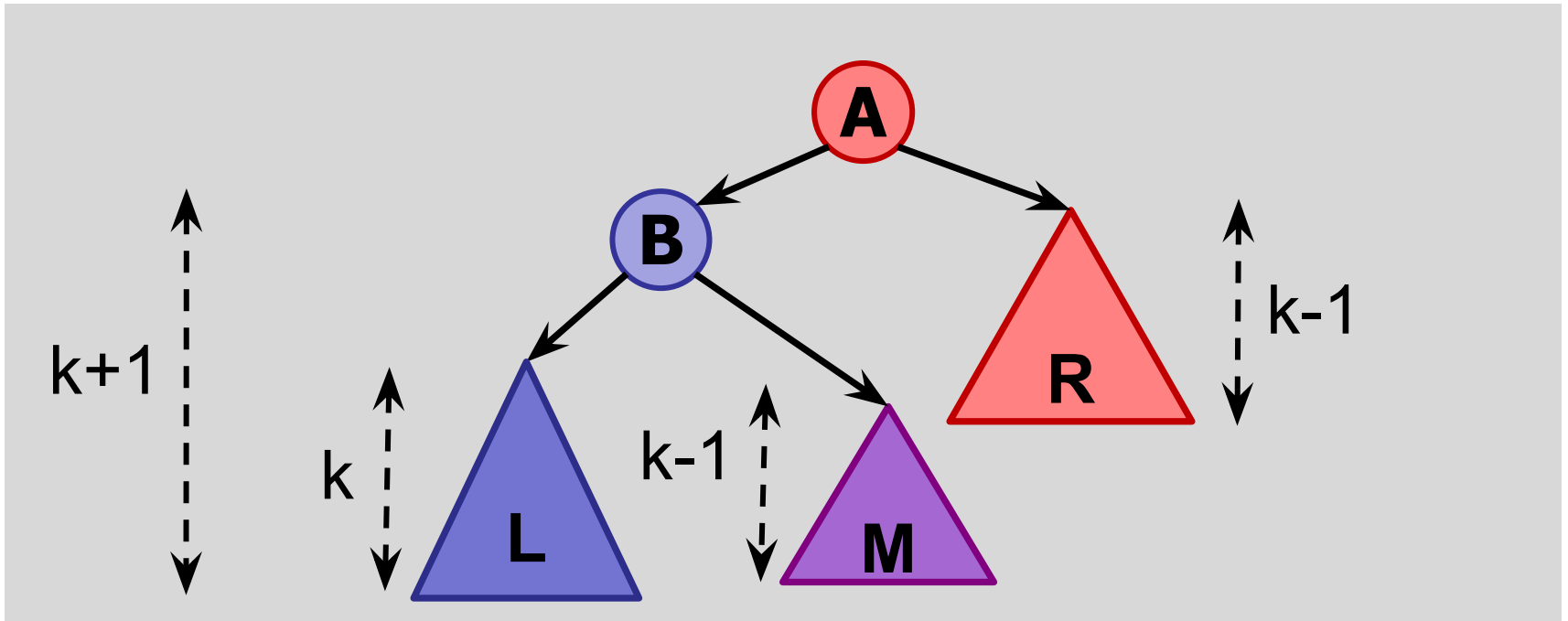


right-rotate:

Case 1: **B** is balanced :  $h(\mathbf{L}) = h(\mathbf{M})$

$$h(\mathbf{R}) = h(\mathbf{M}) - 1$$

# Tree Rotations (Left Heavy)

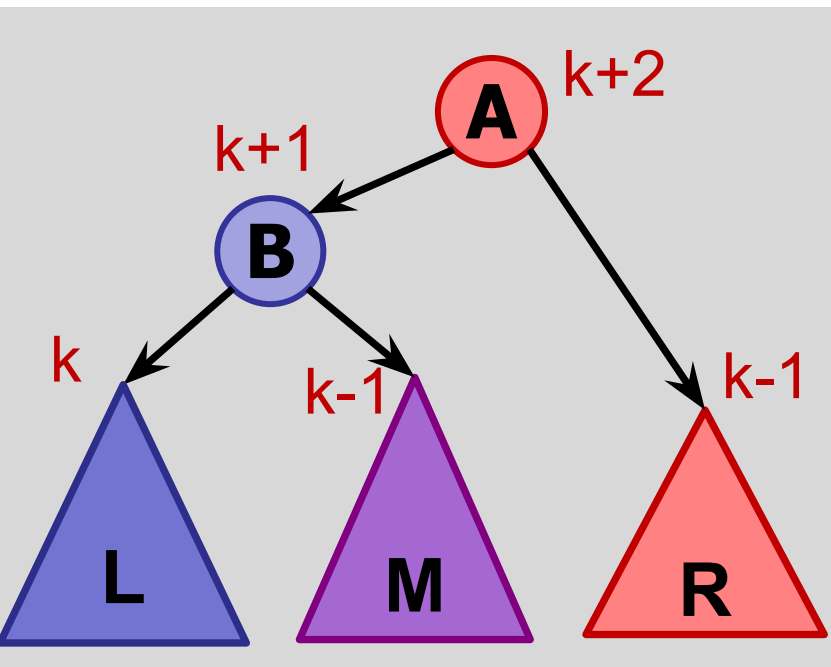


Assume **A** is the lowest node in the tree violating balance property.

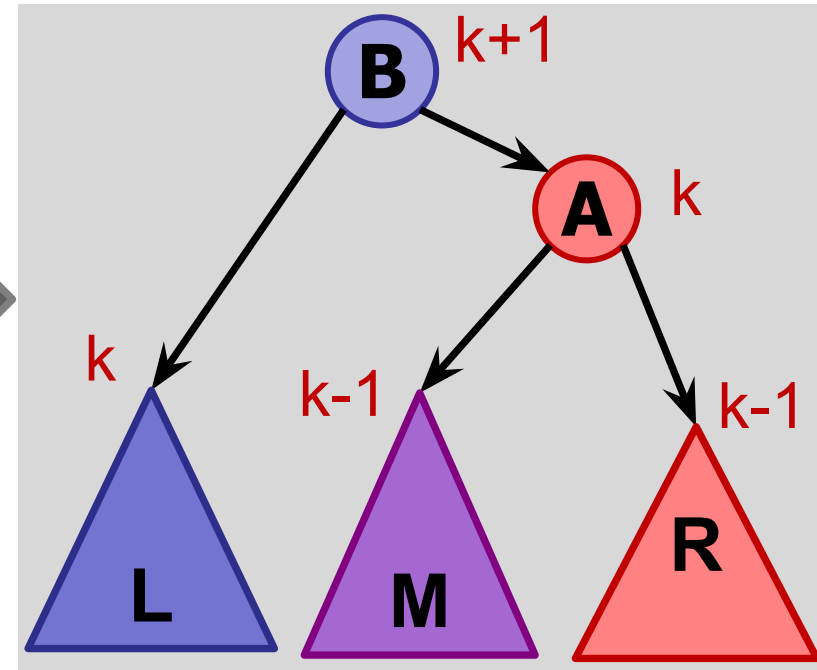
Case 2: **B** is left heavy :  $h(\mathbf{L}) = h(\mathbf{M}) + 1$

$$h(\mathbf{R}) = h(\mathbf{M})$$

# Tree Rotations



Right  
Rotation

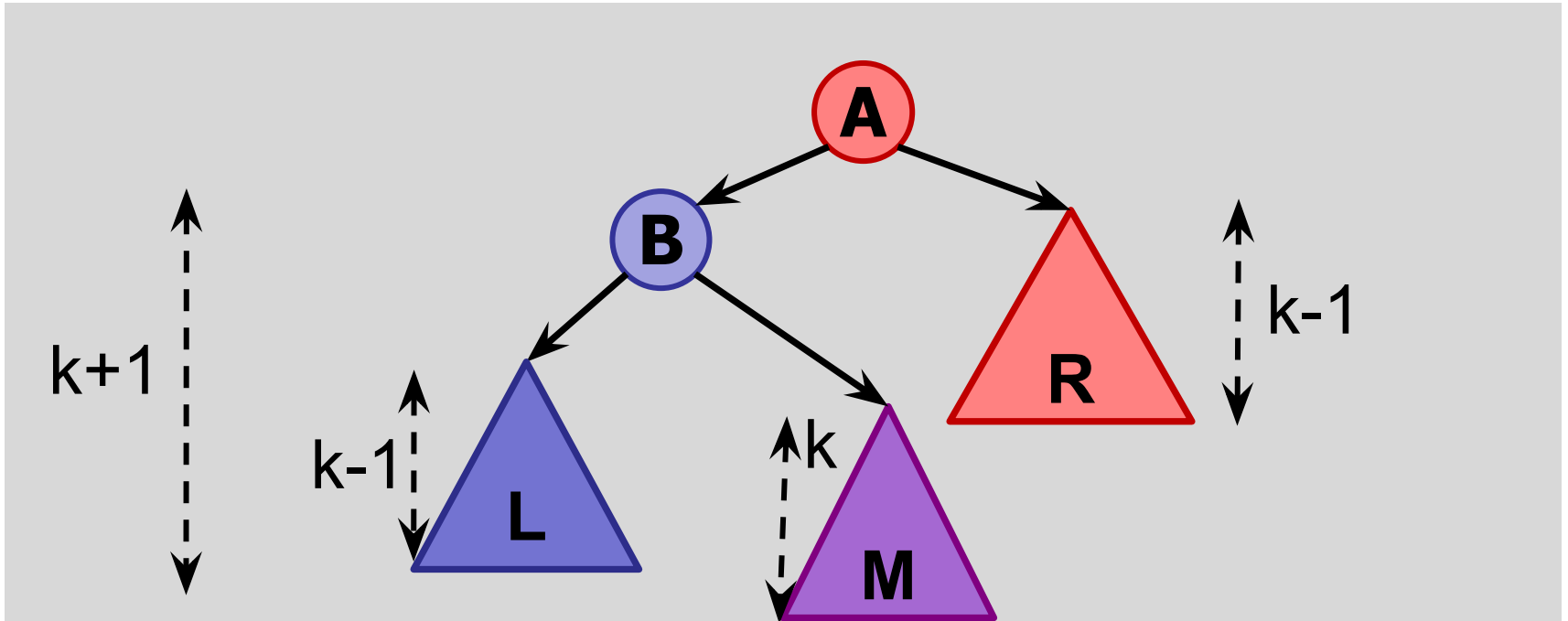


right-rotate:

Case 2: **B** is left-heavy:  $h(\mathbf{L}) = h(\mathbf{M}) + 1$

$$h(\mathbf{R}) = h(\mathbf{M})$$

# Tree Rotations (Left Heavy)

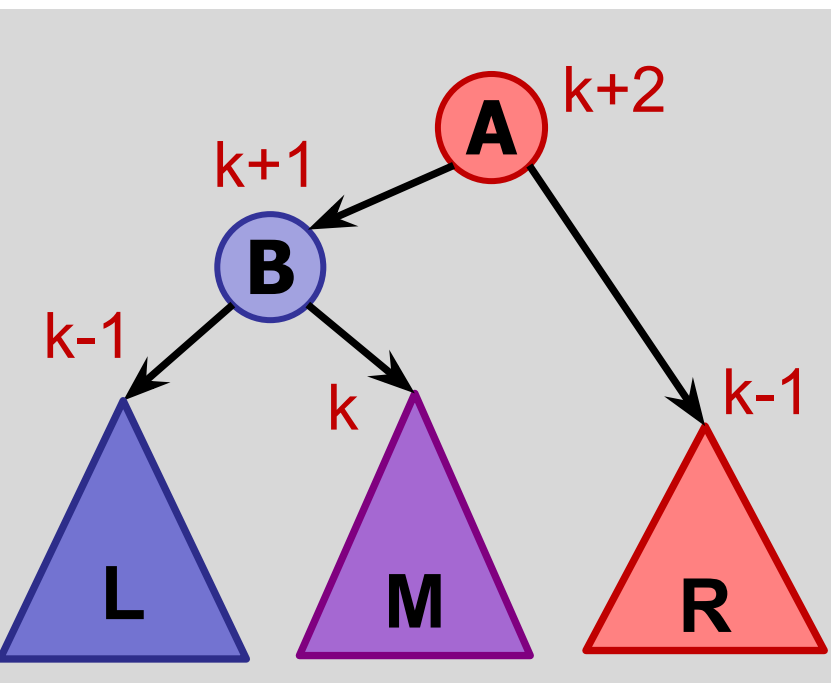


Assume **A** is the lowest node in the tree violating balance property.

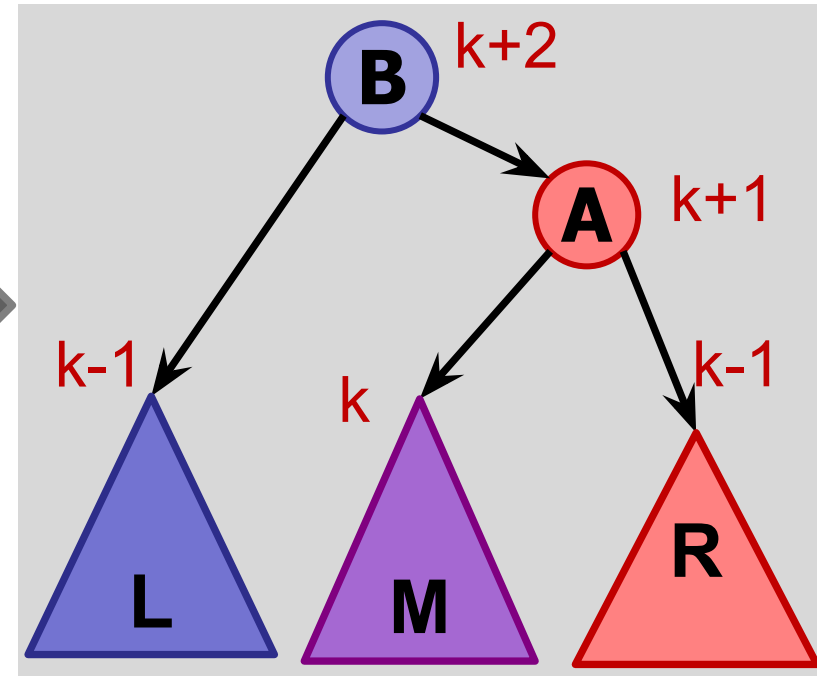
Case 3: **B** is right heavy :  $h(\text{L}) = h(\text{M}) - 1$

$$h(\text{R}) = h(\text{L})$$

# Tree Rotations



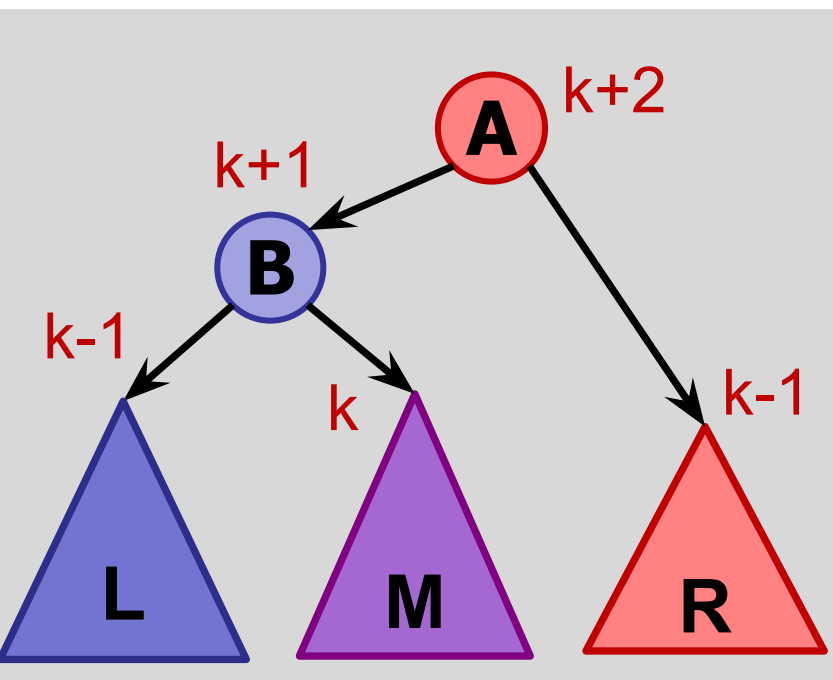
Right  
Rotation



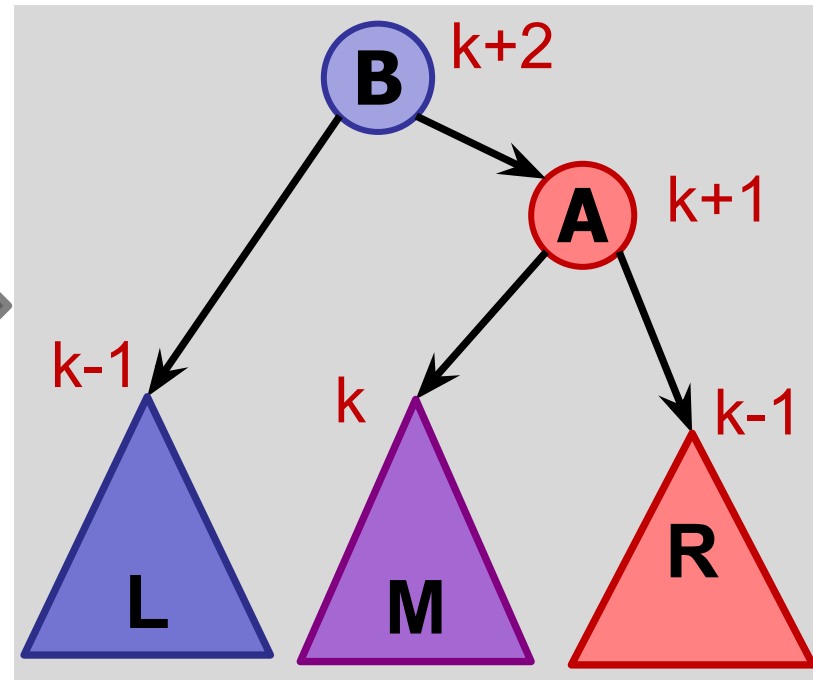

right-rotate:

Case 3: **B** is right-heavy:  $h(\mathbf{L}) = h(\mathbf{M}) - 1$

$$h(\mathbf{R}) = h(\mathbf{L})$$

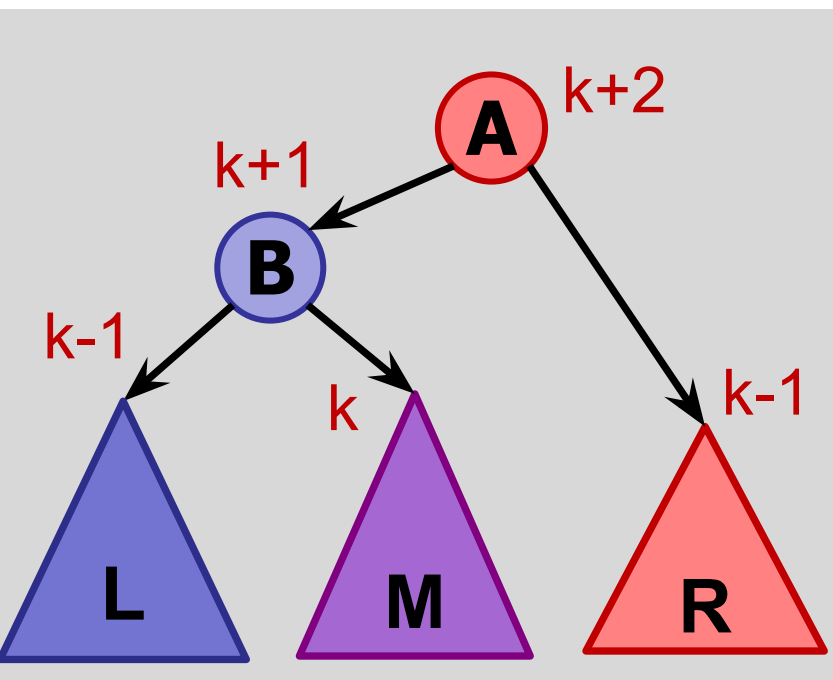


Right  
Rotation

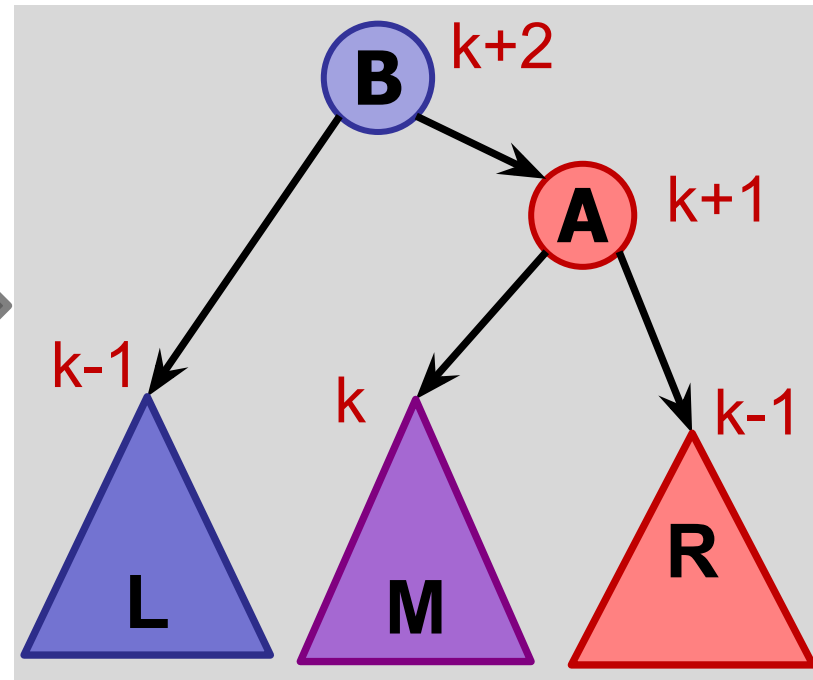



Are we done?

1. Yes.
2. No.
3. Maybe.



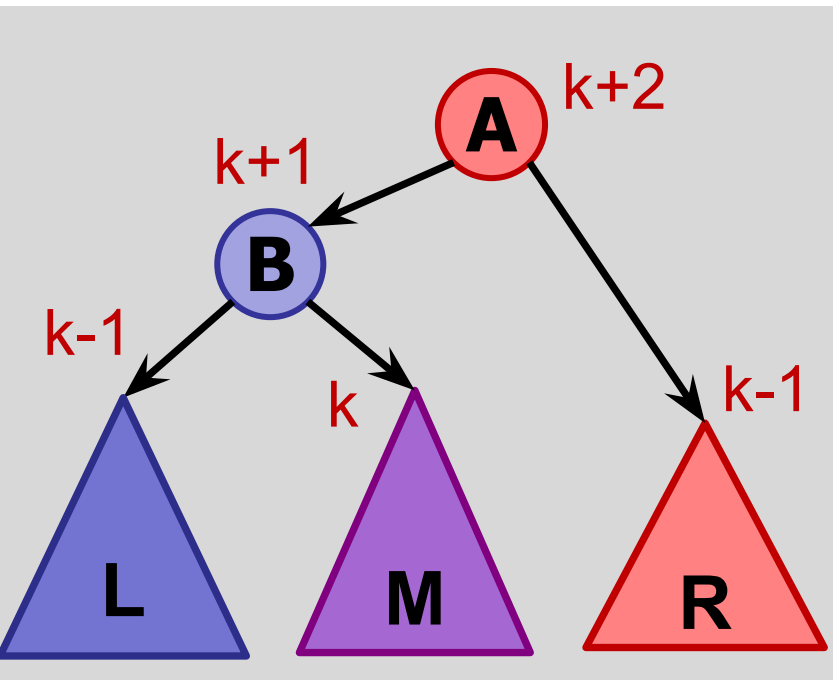
Right  
Rotation



Are we done?

1. Yes.
- ✓ 2. No.
3. Maybe.

# Tree Rotations



Let's do something  
first before we  
right-rotate(A)

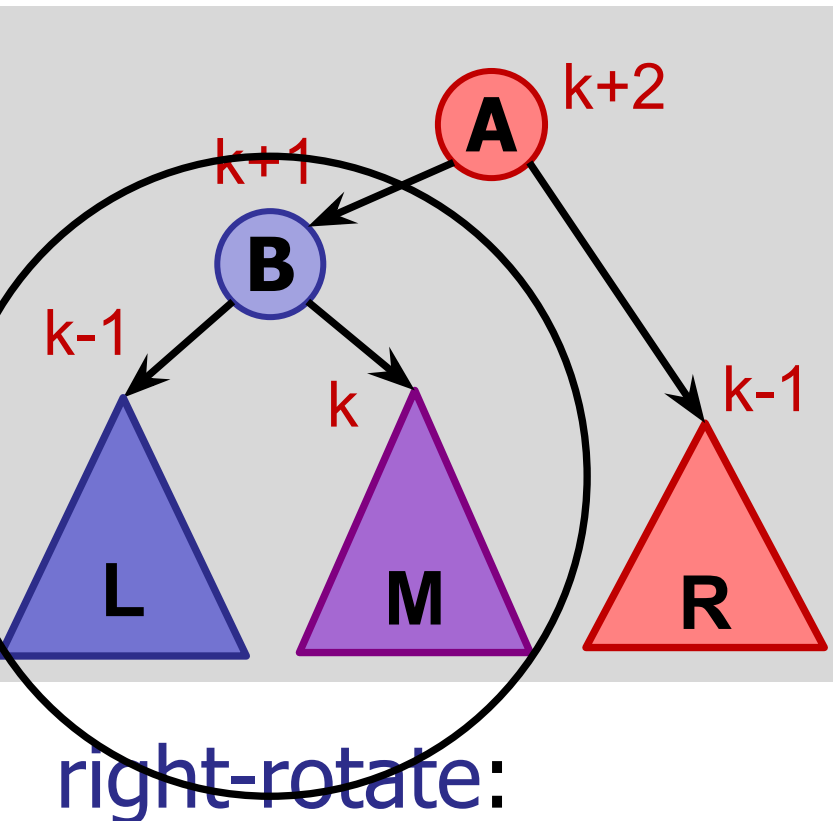
right-rotate:

Case 3: **B** is right-heavy:  $h(\mathbf{L}) = h(\mathbf{M}) - 1$

$$h(\mathbf{R}) = h(\mathbf{L})$$



# Tree Rotations

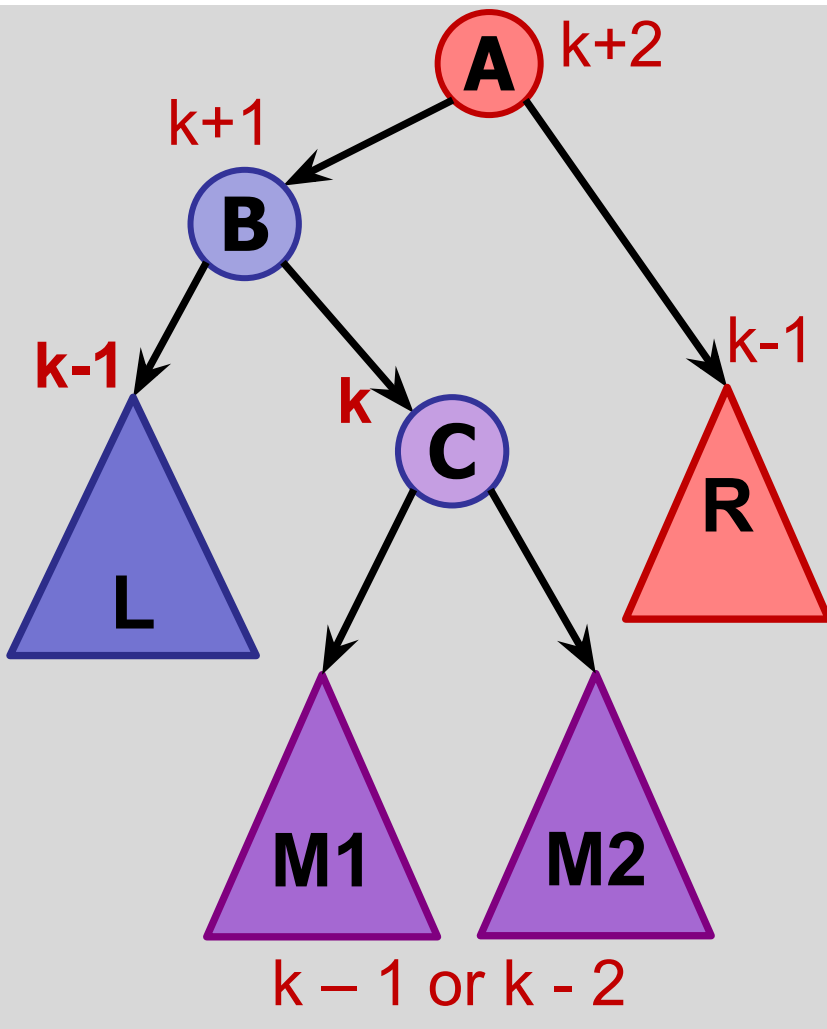


Let's do something  
first before we  
 $\text{right-rotate}(A)$

Case 3: **B** is right-heavy:  $h(\text{L}) = h(\text{M}) - 1$

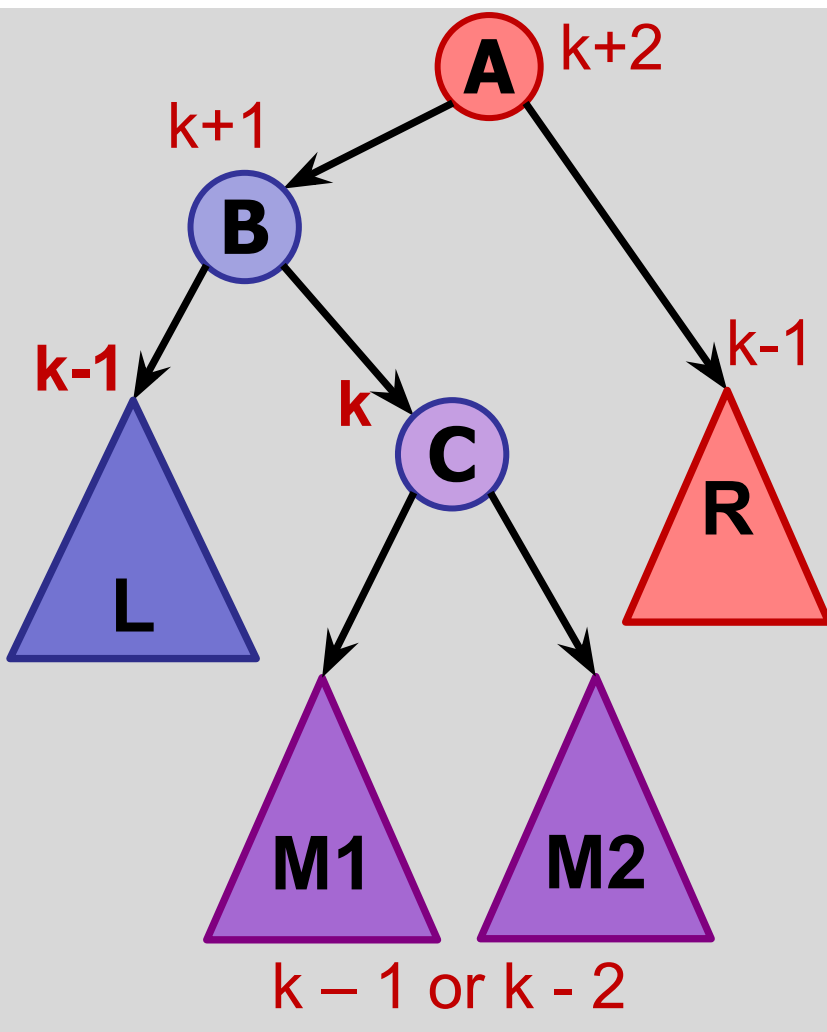
$$h(\text{R}) = h(\text{L})$$

# Tree Rotations

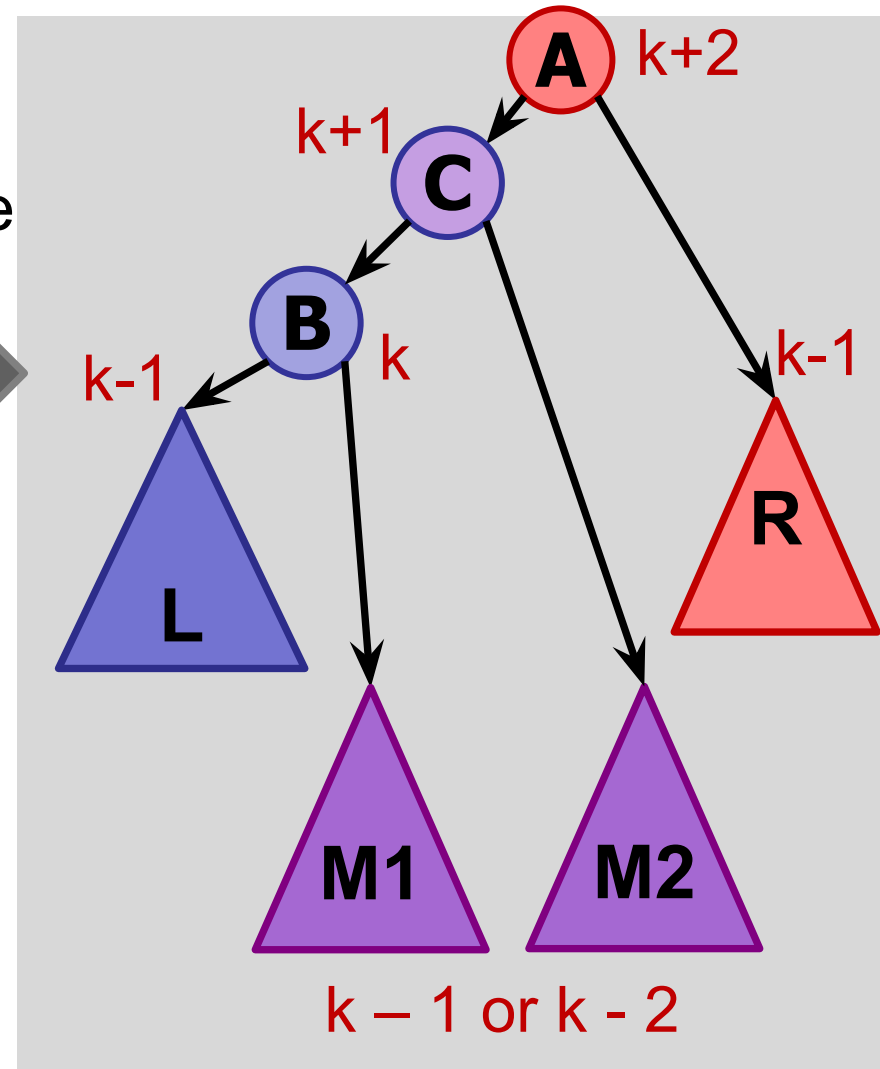
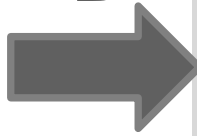


Left-rotate B

# Tree Rotations



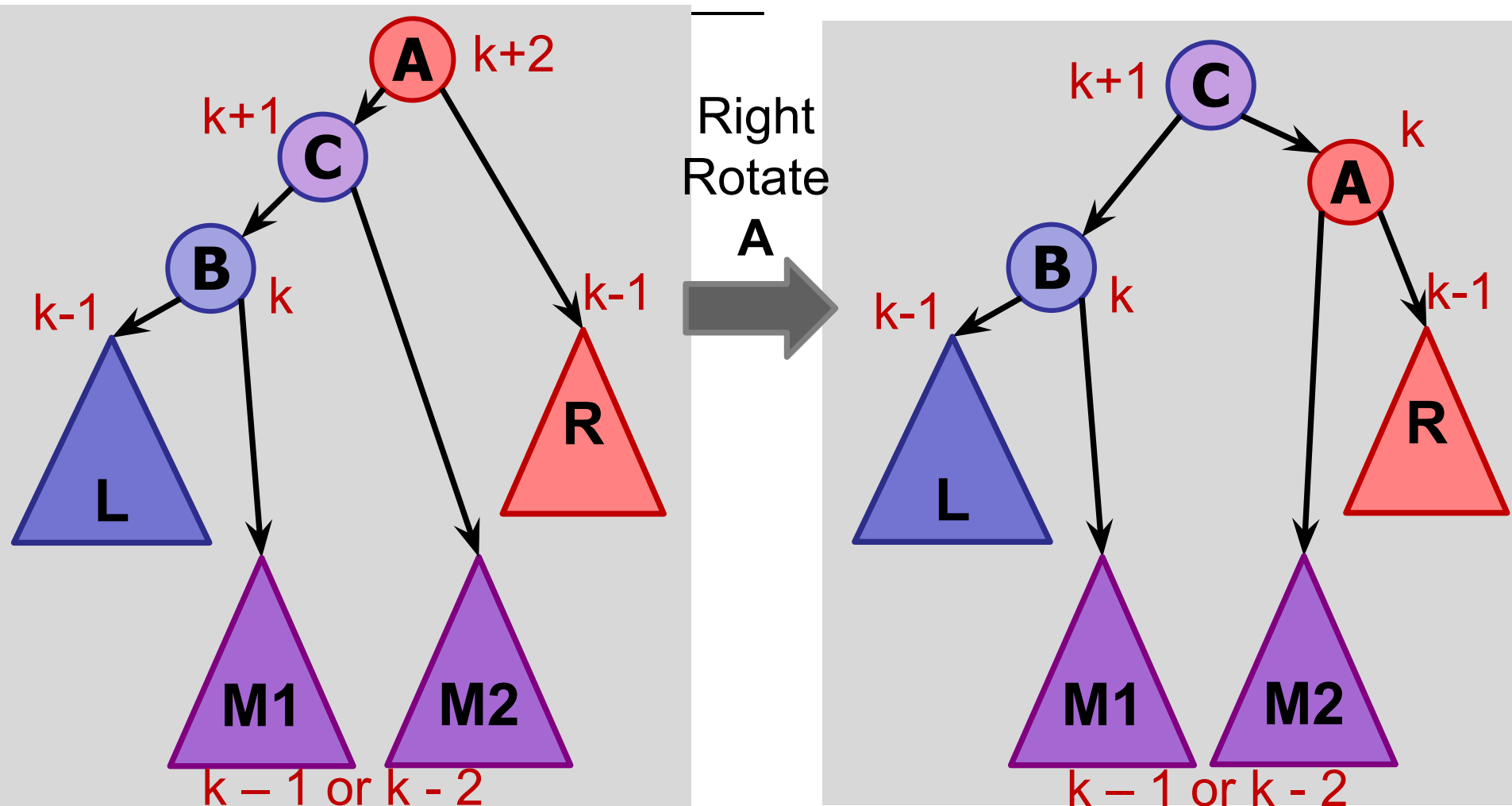
Left  
Rotate  
B



Left-rotate B

After left-rotate B: **A** and **C** still out of balance.

# Tree Rotations



After right-rotate **A**: all in balance.

# Rotations

---

## Summary:

If  $v$  is out of balance and left heavy:

1.  $v.\text{left}$  is balanced:  $\text{right-rotate}(v)$
2.  $v.\text{left}$  is left-heavy:  $\text{right-rotate}(v)$
3.  $v.\text{left}$  is right-heavy:  $\text{left-rotate}(v.\text{left})$   
 $\text{right-rotate}(v)$

If  $v$  is out of balance and right heavy:

Symmetric three cases....

How many rotations do you need after an insertion (in the worst case)?

1. 1
2. 2
3. 4
4.  $\log(n)$
5.  $2\log(n)$
6.  $n$

How many rotations do you need after an insertion (in the worst case)?

1. 1
2. 2
3. 4
4.  $\log(n)$
5.  $2\log(n)$
6.  $n$

Question:

Why isn't it  $2\log(n)$ ?

How many rotations do you need after an insertion (in the worst case)?

1. 1
- ✓ 2. 2
3. 4
4.  $\log(n)$
5.  $2\log(n)$
6.  $n$

We can actually  
bound it by 2



# Insert in AVL Tree

---

## Summary:

- Insert key in BST.
- Walk up tree:
  - At every step, check for balance.
  - If out-of-balance, use rotations to rebalance.
  - Then we are done

# Insert in AVL Tree

---

## Summary:

- Insert key in BST.
- Walk up tree:
  - At every step, check for balance.
  - If out-of-balance, use rotations to rebalance.
  - Then we are done

Note: only need to perform two rotations

- Why?
- In cases 2, 3: reduce height of sub-tree by 1
- Case 3: Next week

# Today and Next Week

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## Trees

- Terminology
- Traversals
- Operations

## Balanced Trees

- Height-balanced binary search trees
- AVL trees
- Rotations