

# Algorithms and Data Structures for Data Science

## Balanced Binary Search Trees

CS 277

March 18, 2024

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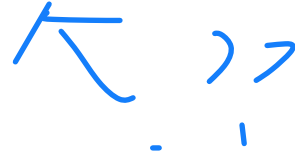
Reminder: Exam 2 this week!

# Reminder: I'm out of town starting tomorrow

Wednesday lecture will be async online.

Friday lab will be run by TAs

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# Learning Objectives

Review tree runtimes for binary search trees

Introduce the AVL tree

— balance

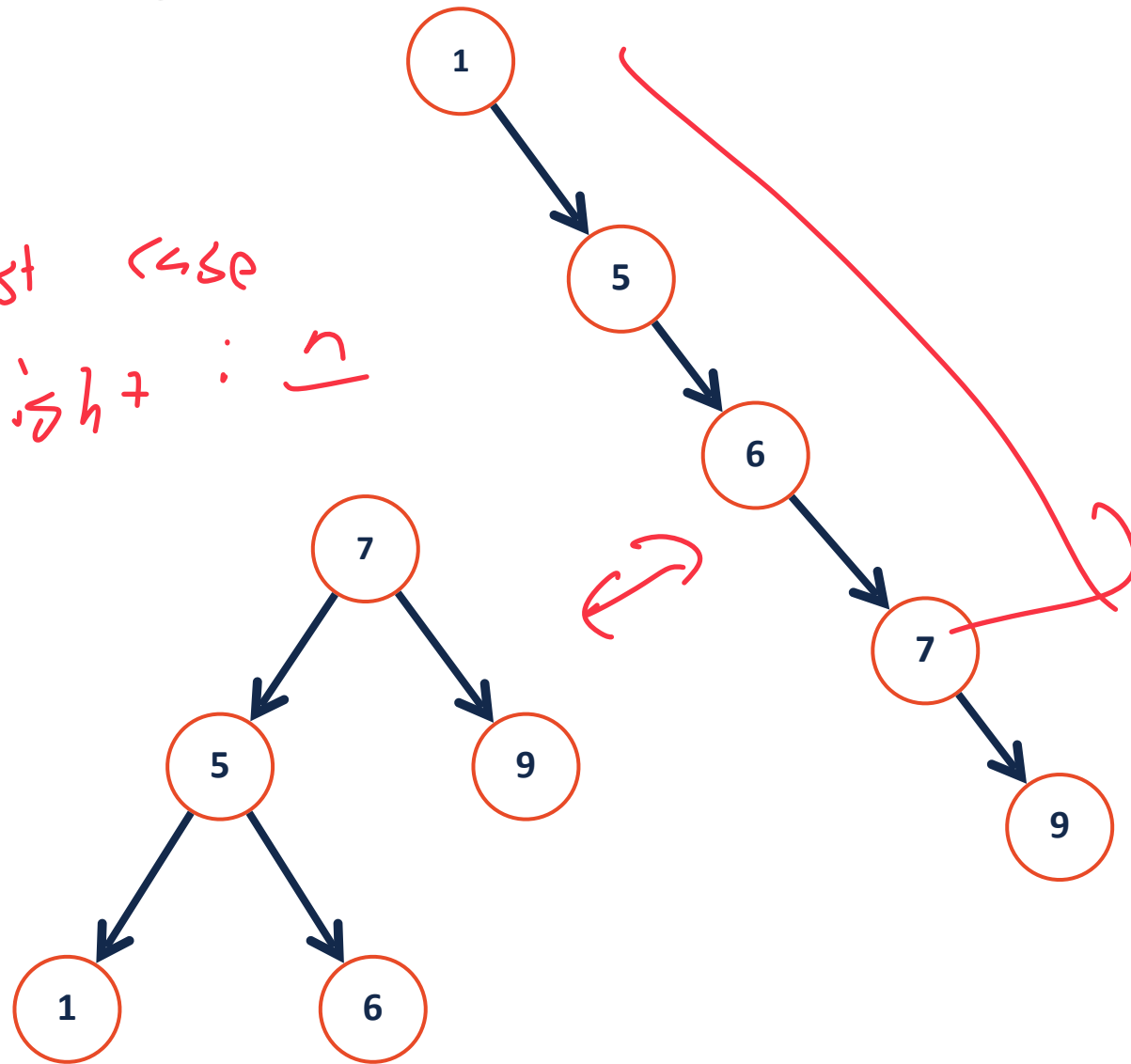


Demonstrate how AVL tree rotations work

# BST Analysis – Running Time

	BST Worst Case
<b>find</b>	$O(h)$
<b>insert</b>	$O(h)$
<b>delete</b>	$O(h)$
<b>traverse</b>	$O(n)$

Worst case  
height :  $n$



# BST Analysis

Every operation on a BST depends on the **height** of the tree.

... how do we relate  $O(h)$  to  $n$ , the size of our dataset?

$$f(n) \leq h \leq g(n)$$

$$f(h) \leq n \leq g(h)$$

# BST Analysis

binary  
n

Draw some  
examples!

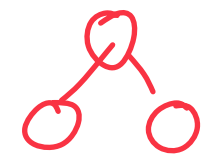
What is the max number of nodes in a tree of height  $h$ ?

$h=0$



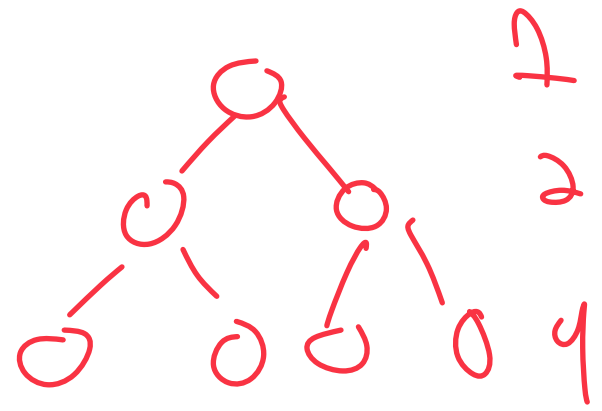
$$2^0 + 2^1 + 2^2 + \dots + 2^h$$

$h=1$



$$n = 2^{h+1} - 1 \quad \text{max nodes}$$

$h=2$



$$\downarrow \log$$
$$\log n \approx h+1$$

$$h \approx O(\log n)$$

min height

# BST Analysis

What is the min number of nodes in a tree of height  $h$ ?

$h=0$  

$h=1$  

$h=2$  

Min is  $h+1$





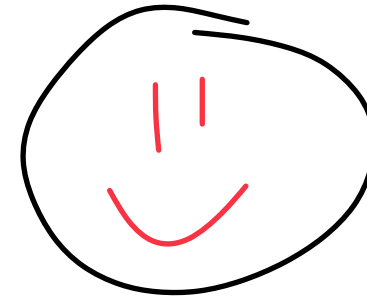
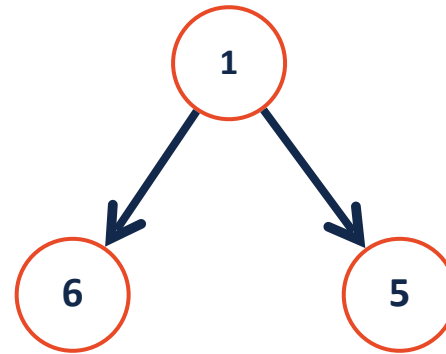
# BST Analysis

A BST of  $n$  nodes has a height between:

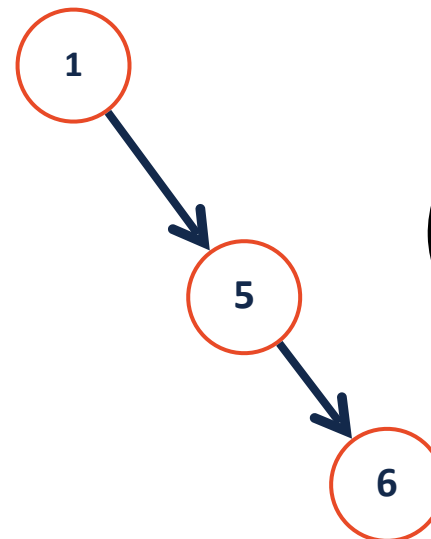
**Lower-bound:**  $O(\log n)$

$$h = O(\log n)$$

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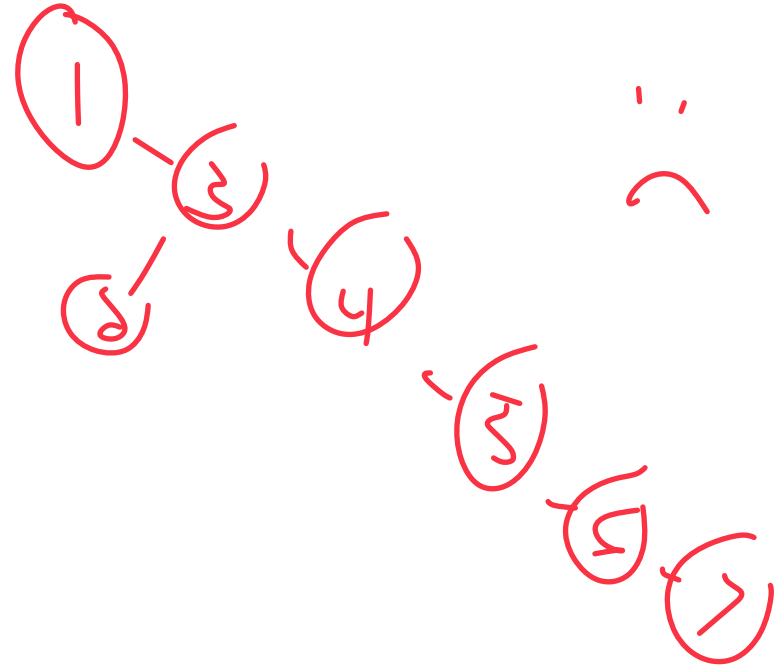
**Upper-bound:**  $O(n)$



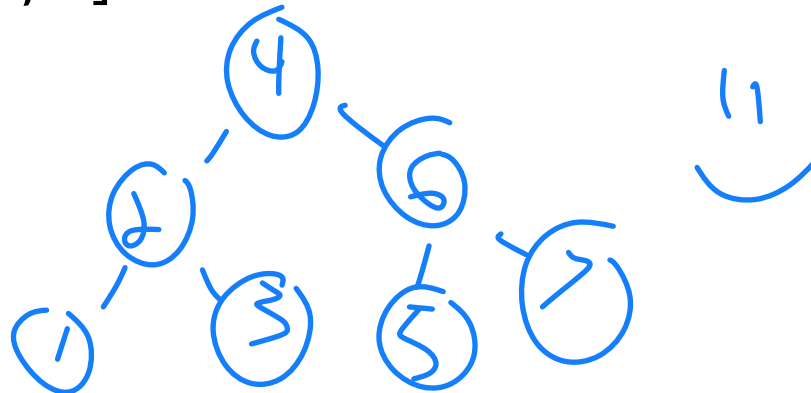
# Correcting bad insert order

The height of a BST depends on the order in which the data was inserted

**Insert Order:** [1, 3, 2, 4, 5, 6, 7]

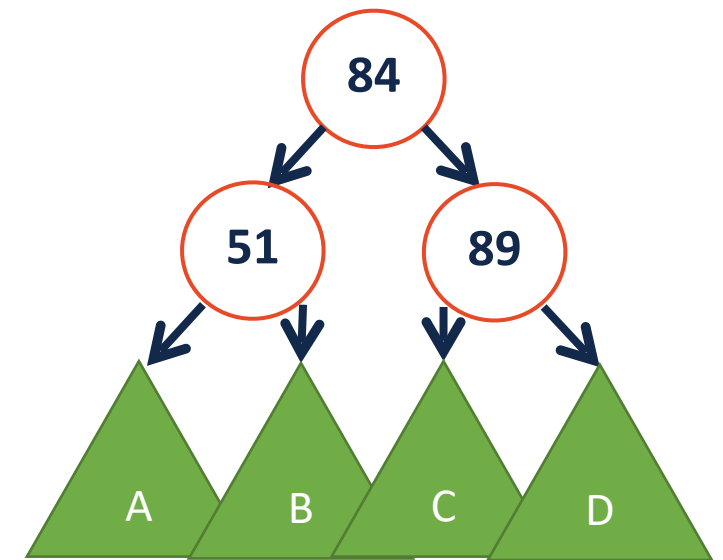
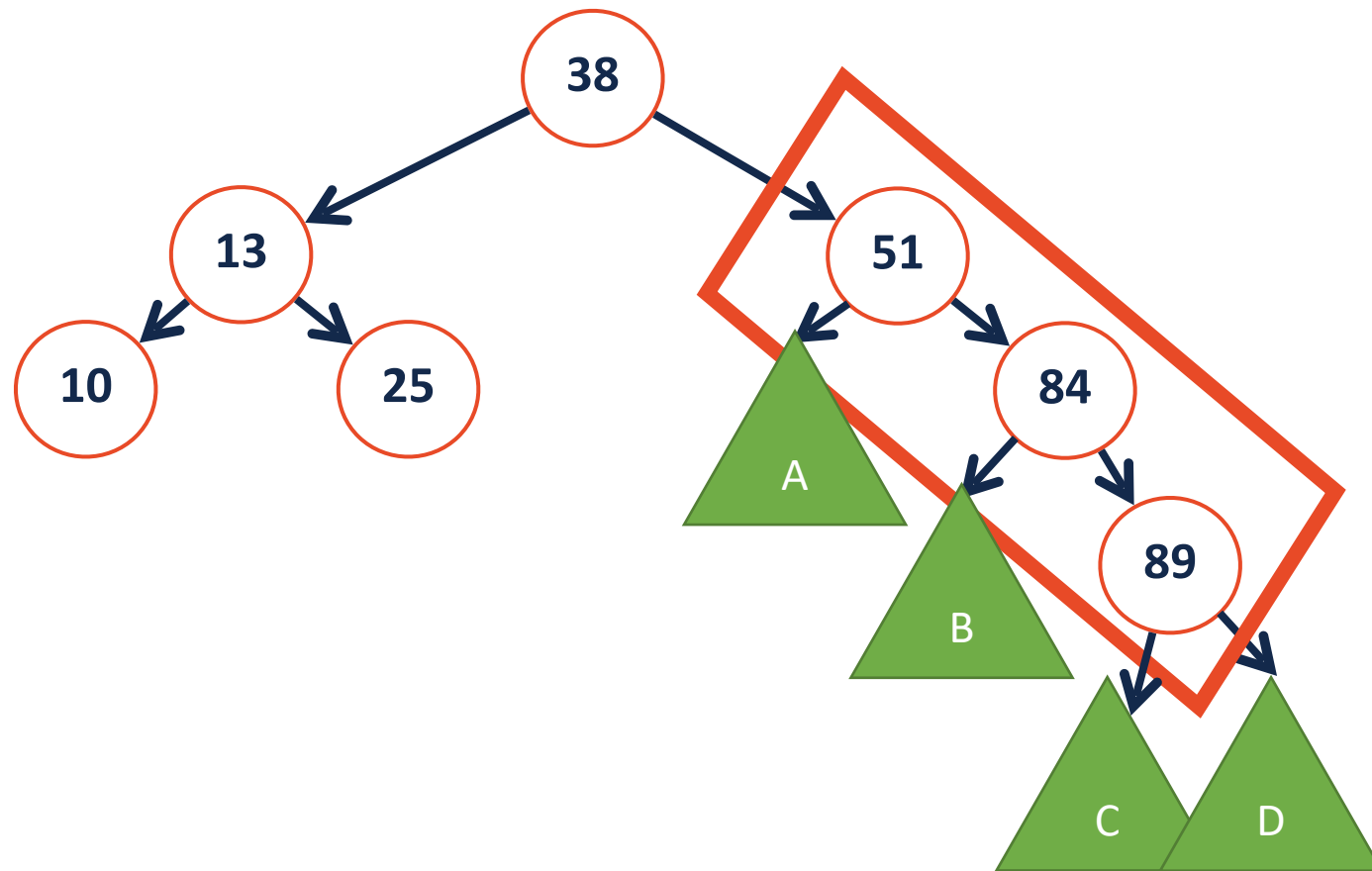


**Insert Order:** [4, 2, 3, 6, 7, 1, 5]



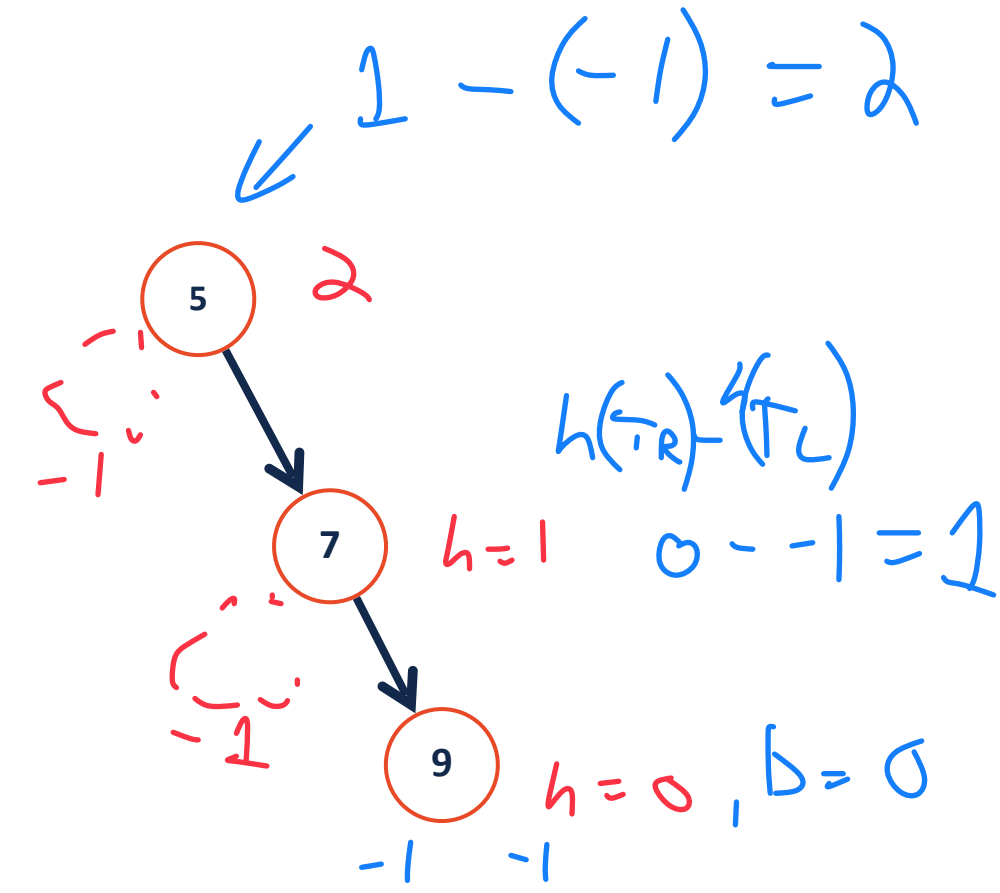
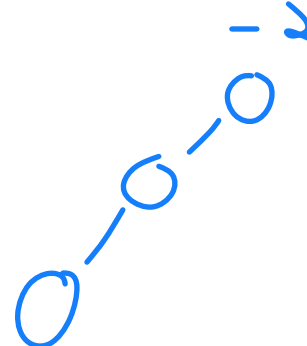
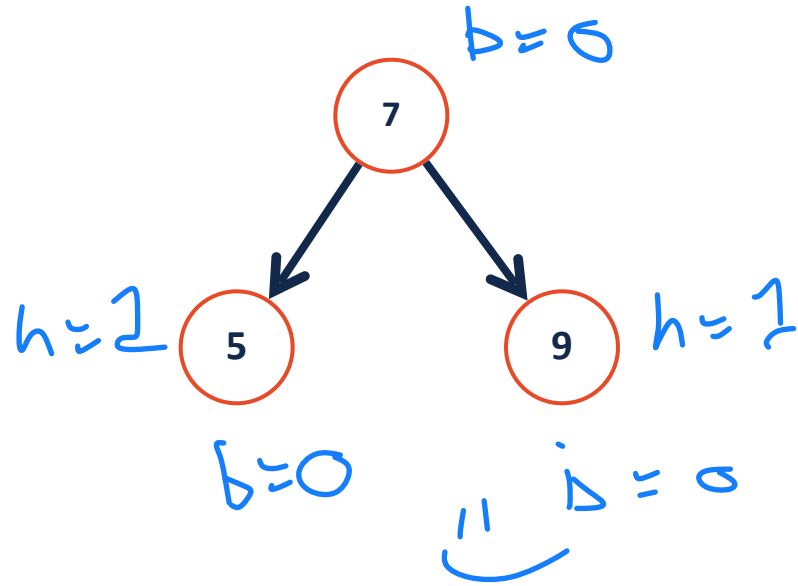
# AVL-Tree: A self-balancing binary search tree

Rather than fixing an insertion order, just correct the tree as needed!



# Height-Balanced Tree

What tree is better?



**Height balance:**  $b = \text{height}(T_R) - \text{height}(T_L)$

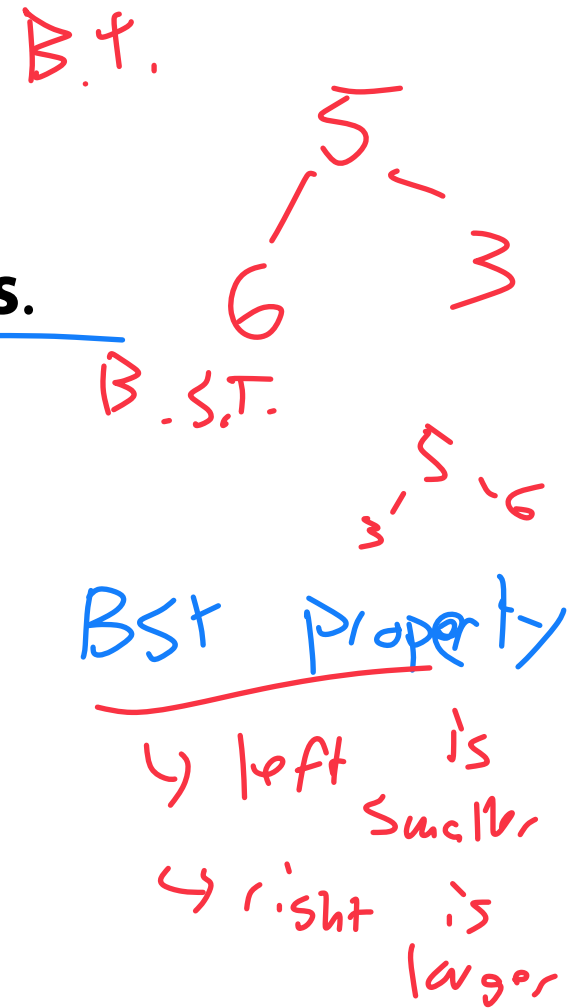
A tree is "balanced" if: for all nodes,  $|\text{balance}| \leq 1$

# BST Rotations (The AVL Tree)

We can adjust the BST structure by performing rotations.

These rotations:

1. Modify the order of nodes and keep
2. Reduce tree height by one



# BST Rotations (The AVL Tree)

We can adjust the BST structure by performing **rotations**.

↳ Balance for every node

height

None: -1

○: 0

○-○: 1

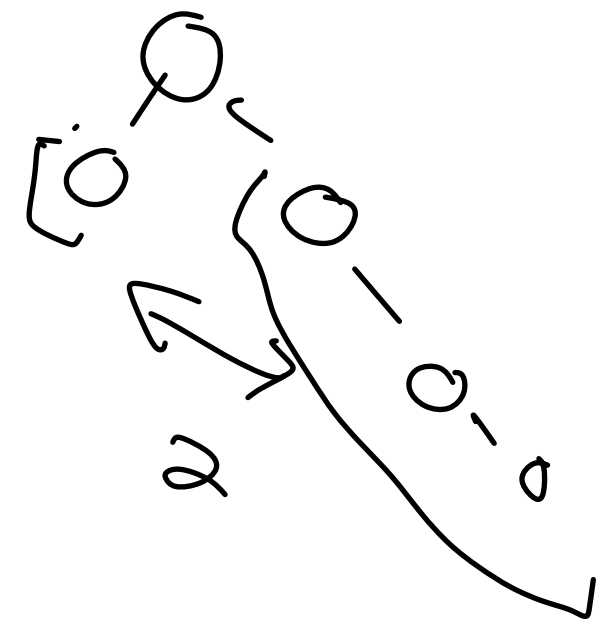
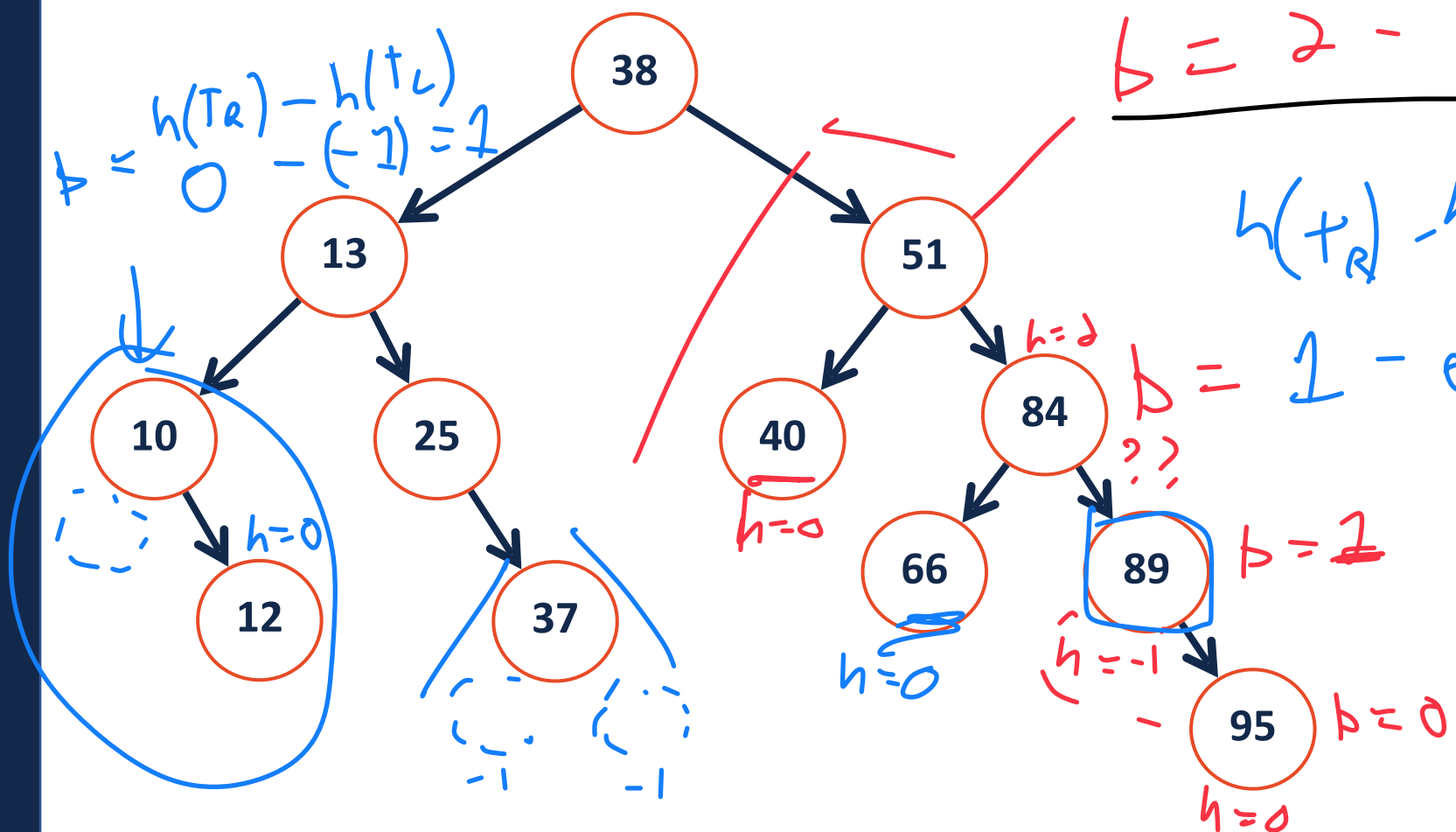
$$b = 2 - 0 = 2$$

$$h(t_R) - h(t_L)$$

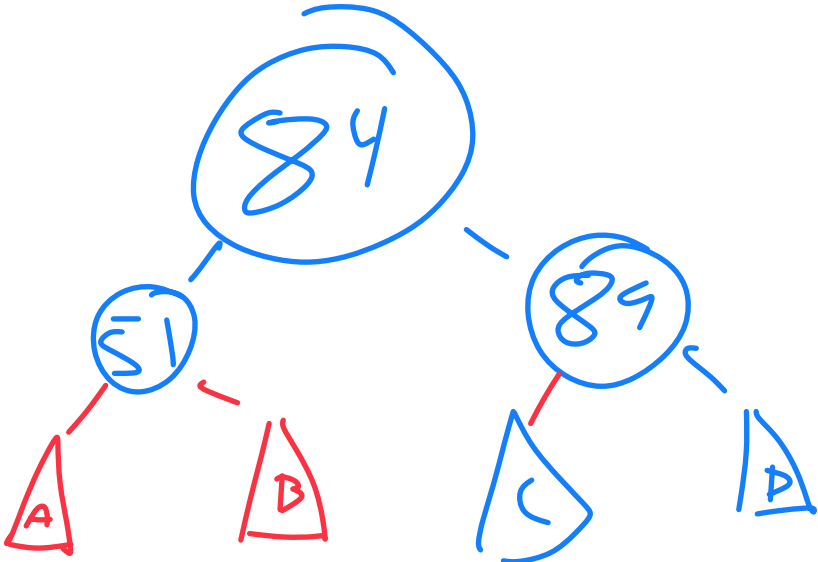
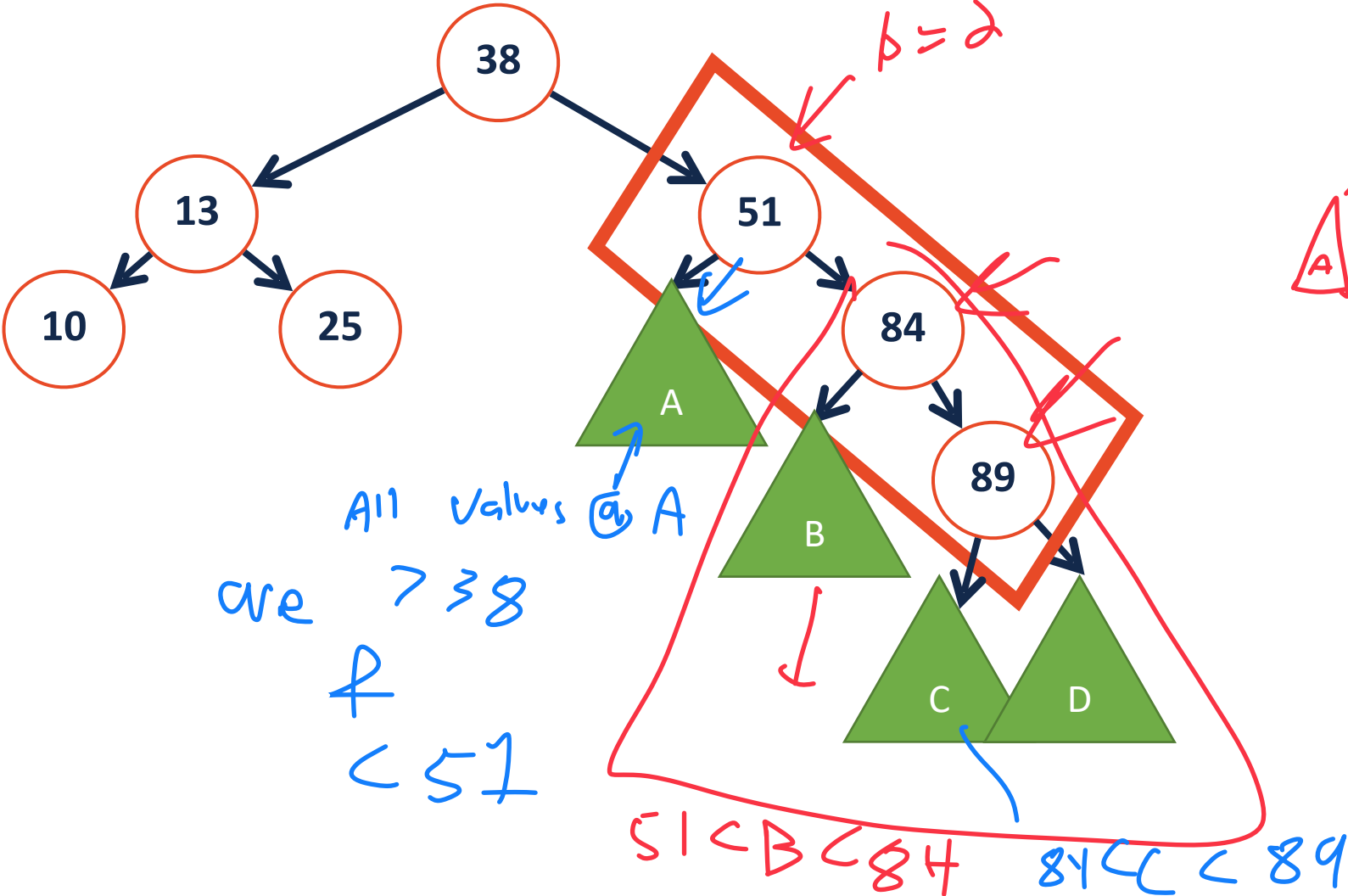
$$b = 1 - 0$$

$$b = 2$$

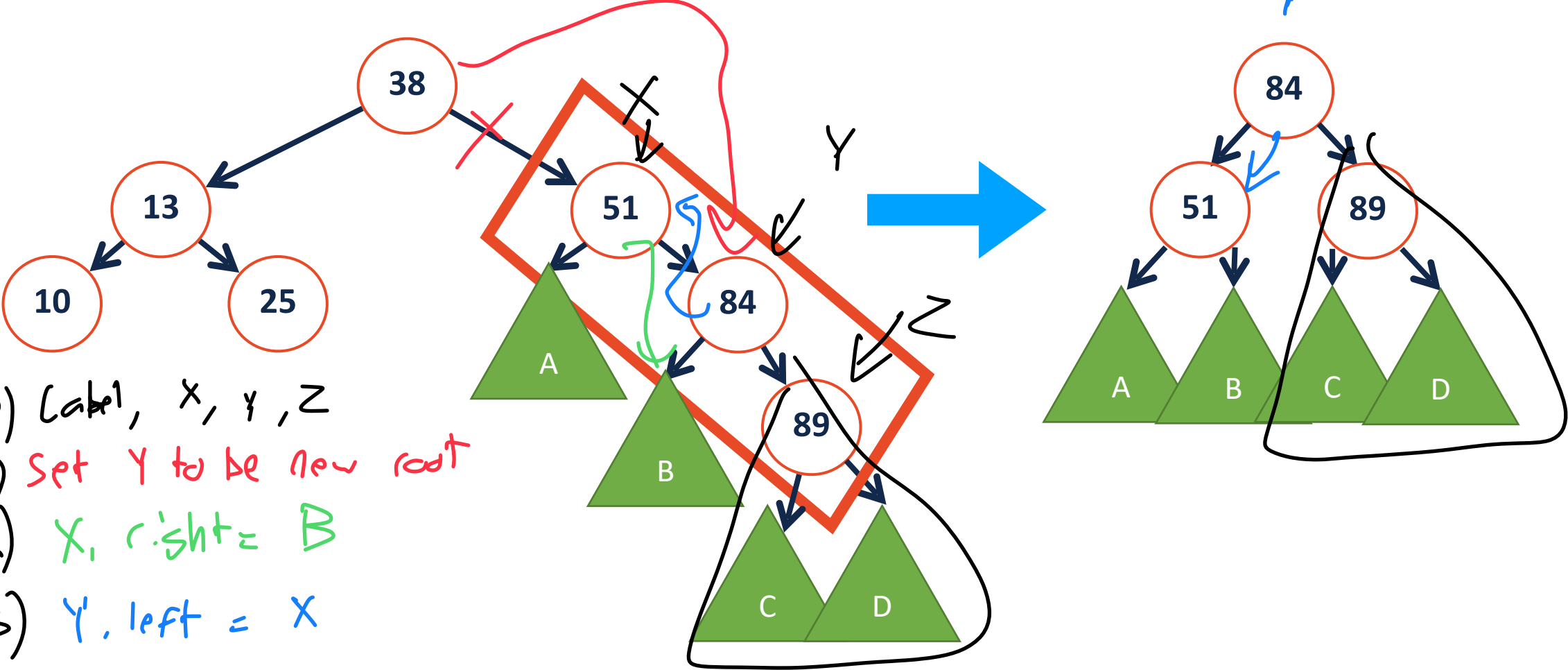
$$b = 0$$



# Left Rotation



# Left Rotation

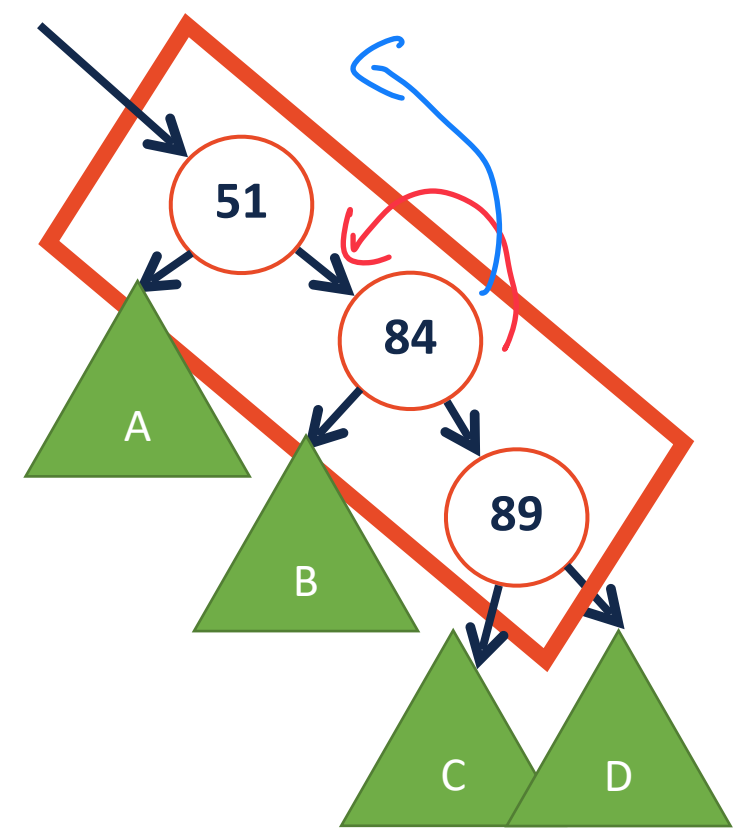




# Coding AVL Rotations

Two ways of visualizing:

1) Think of an arrow 'rotating' around the center



# Coding AVL Rotations

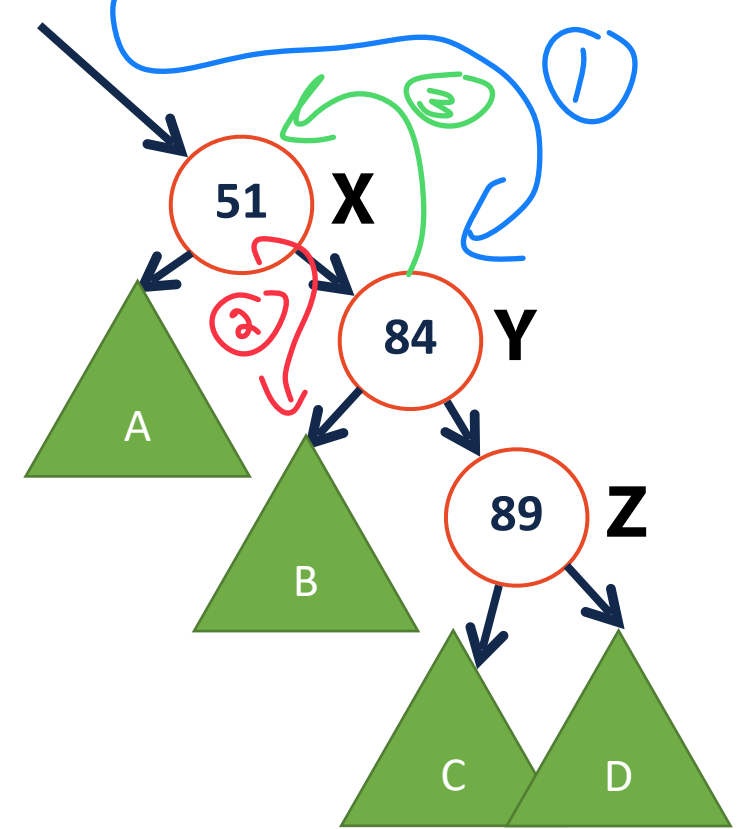
Two ways of visualizing:

2) The rotation will always do the following:

Make node **Y** the new root

Make the subtree **B** **X**'s right child.

Make node **X** the left child of node **Y**



# Coding AVL Rotations

Two ways of visualizing:

1) Think of an arrow 'rotating' around the center

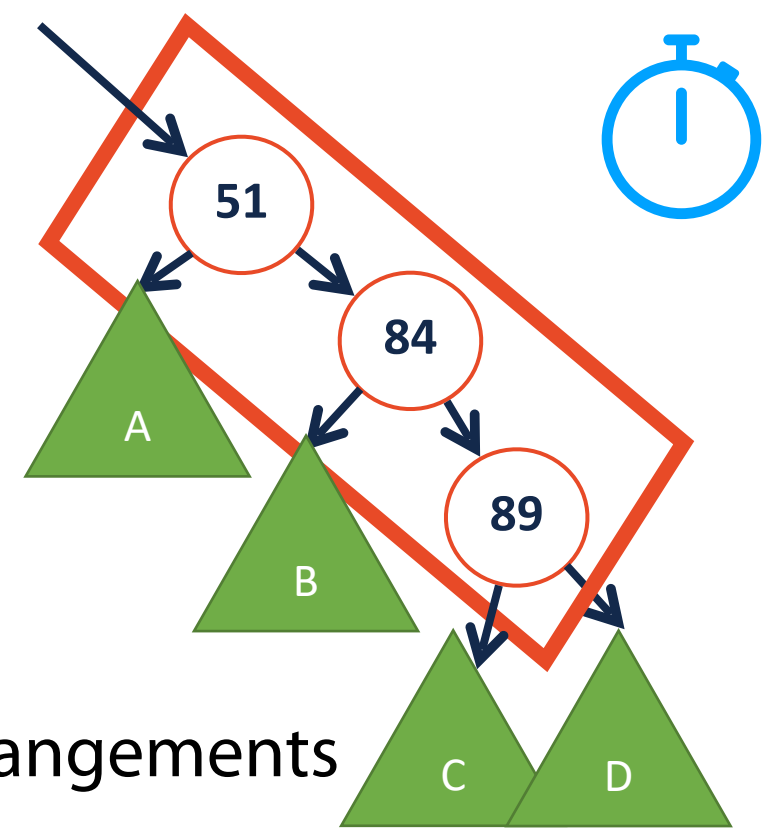
2) Recognize that there's a concrete order for rearrangements

Ex: Unbalanced at current (root) node and need to *rotateLeft*?

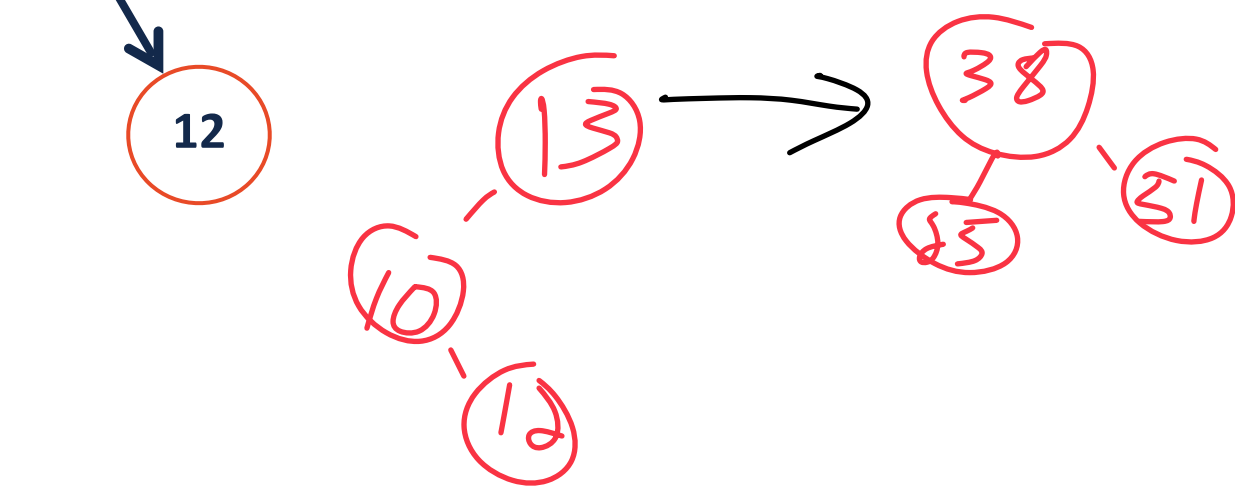
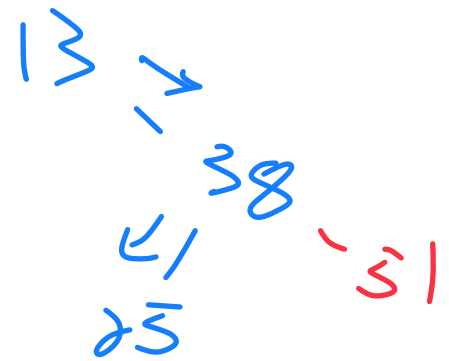
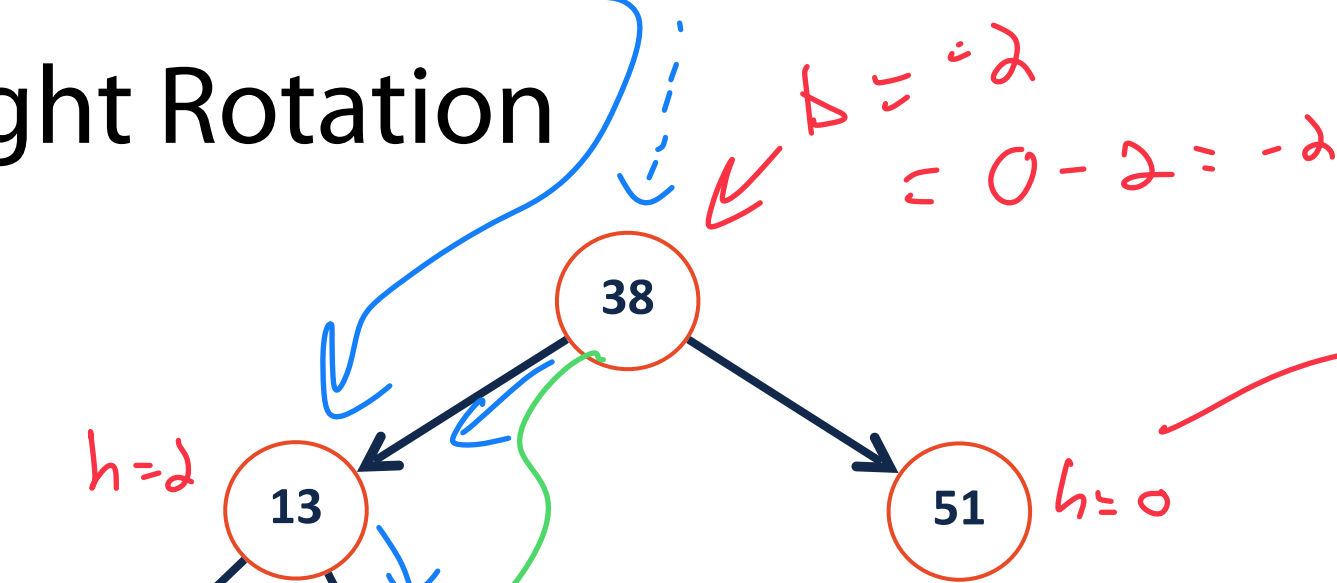
Replace current (root) node with its right child.

Set the right child's left child to be the current node's right

Make the current node the right child's left child

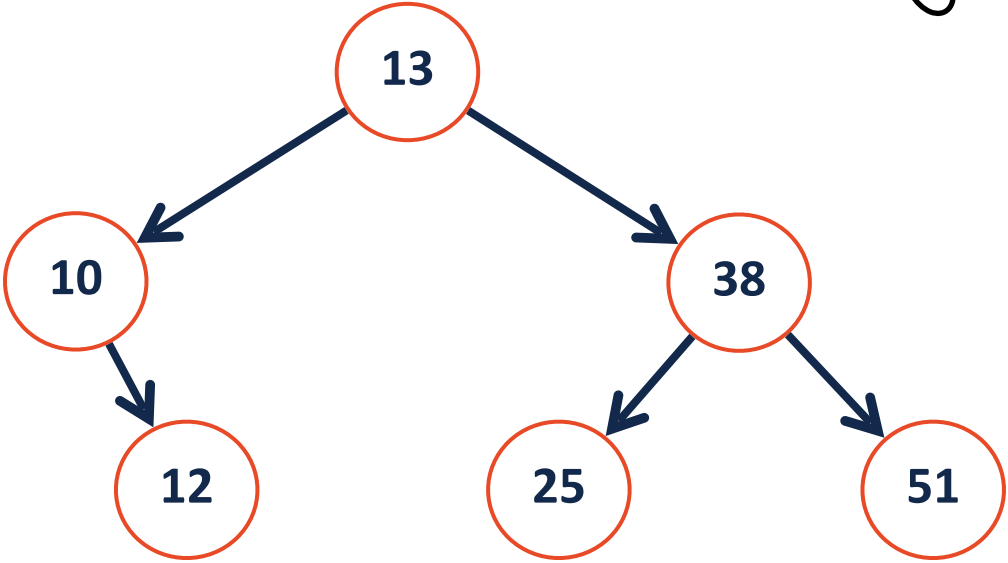
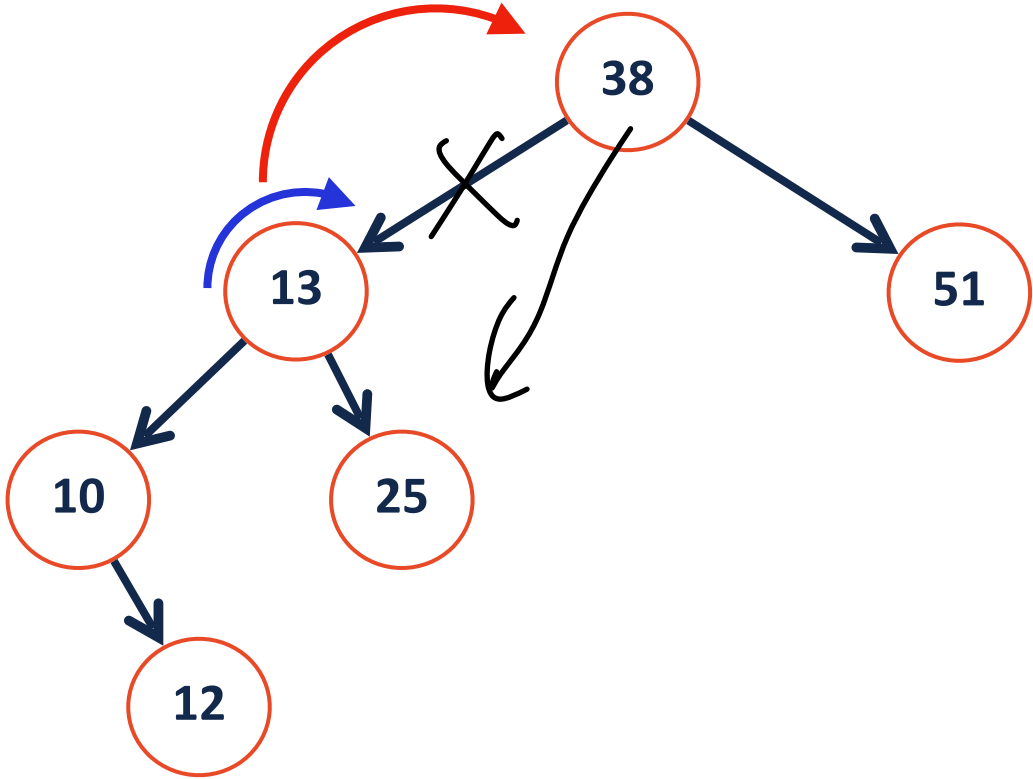


# Right Rotation



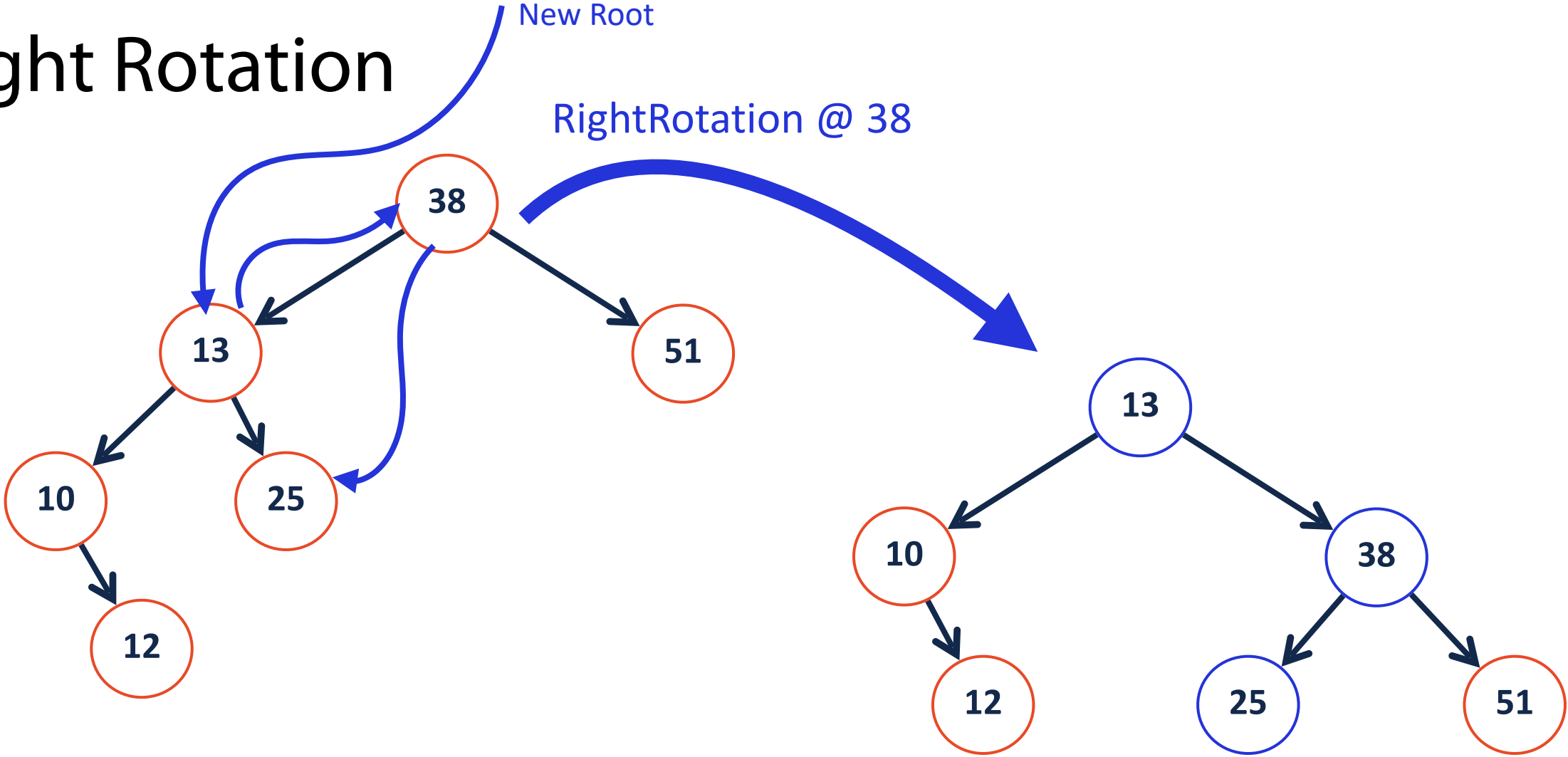
- 1) Make 13 new root
- 2) Old root left = new root right
- 3) Make 38 right child of 13

# Right Rotation

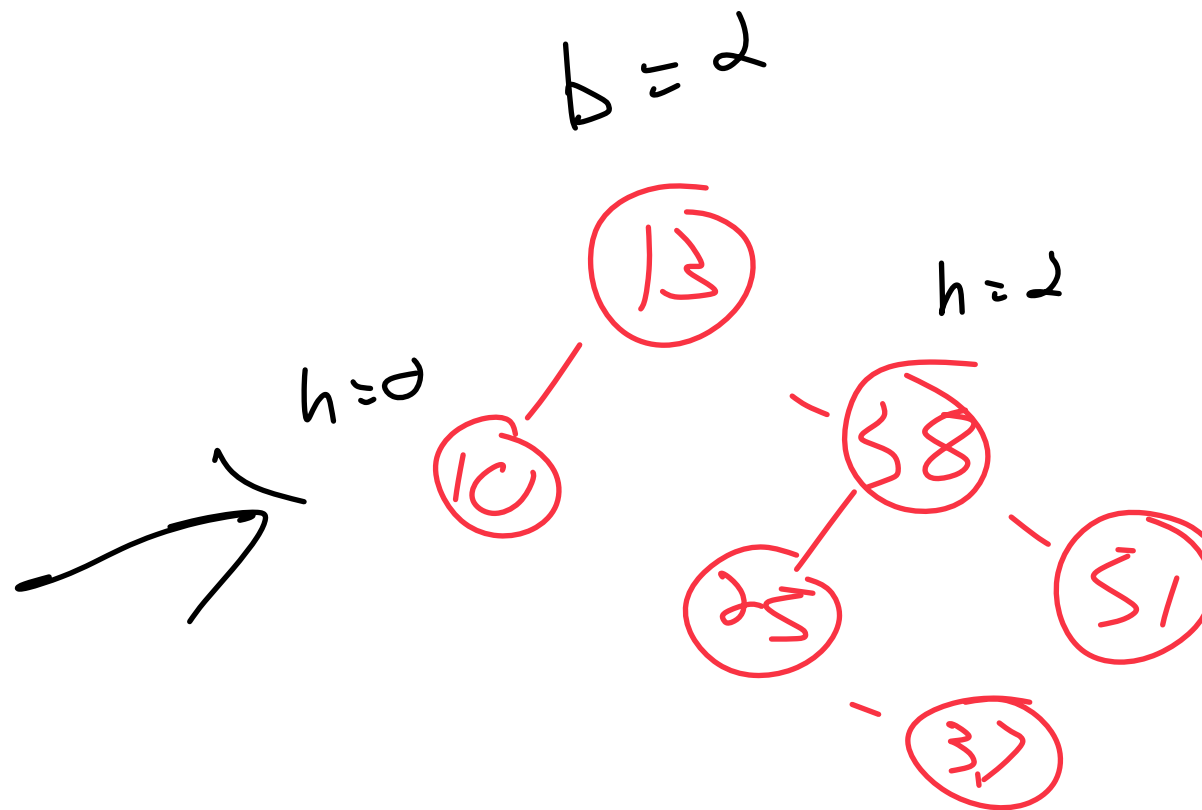
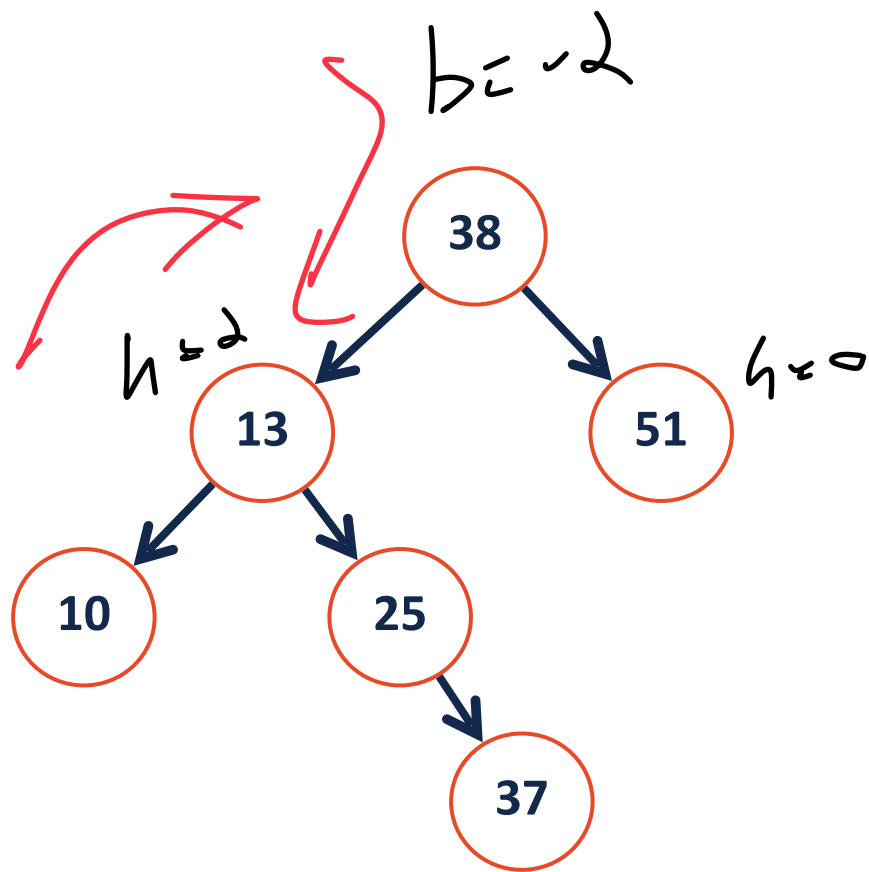


Go down

# Right Rotation

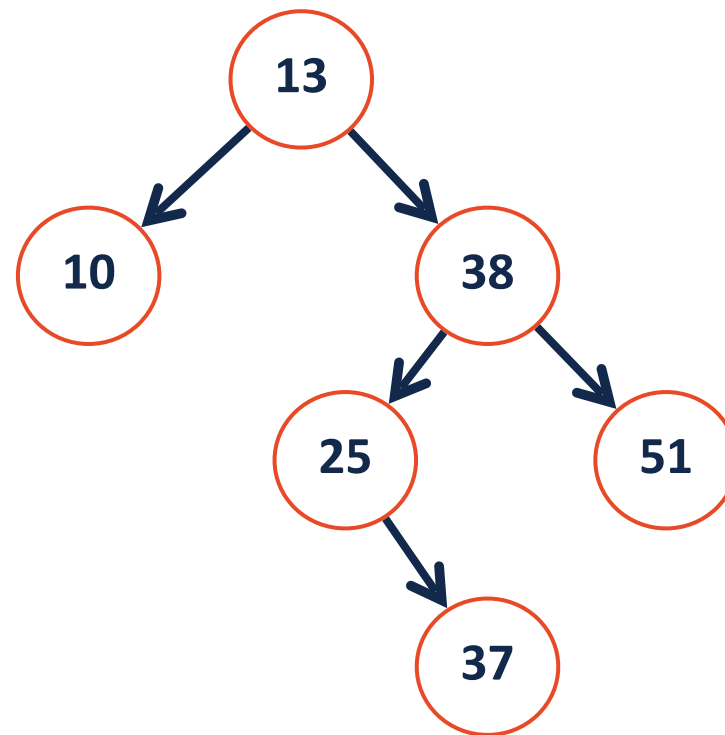
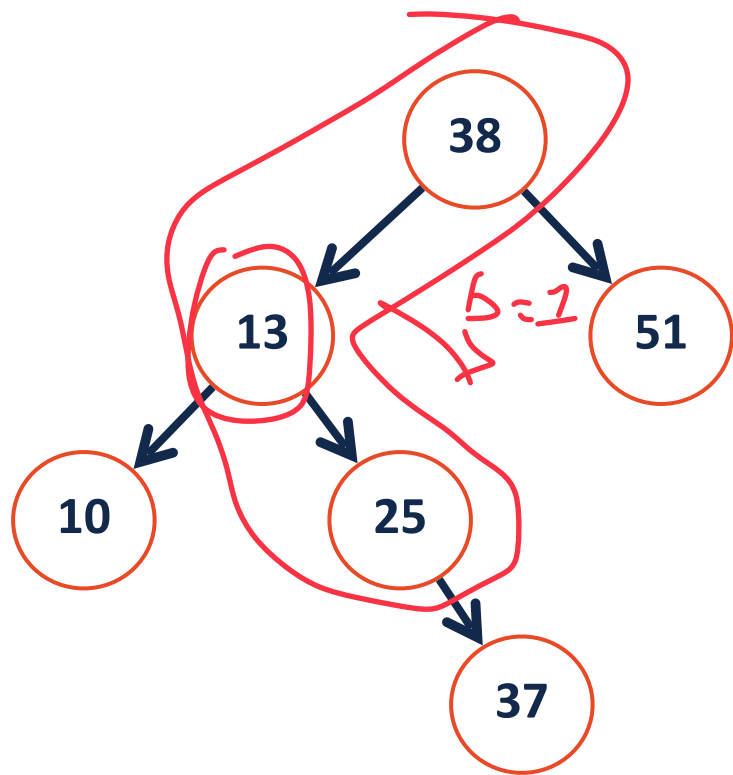


# AVL Rotation Practice



# AVL Rotation Practice

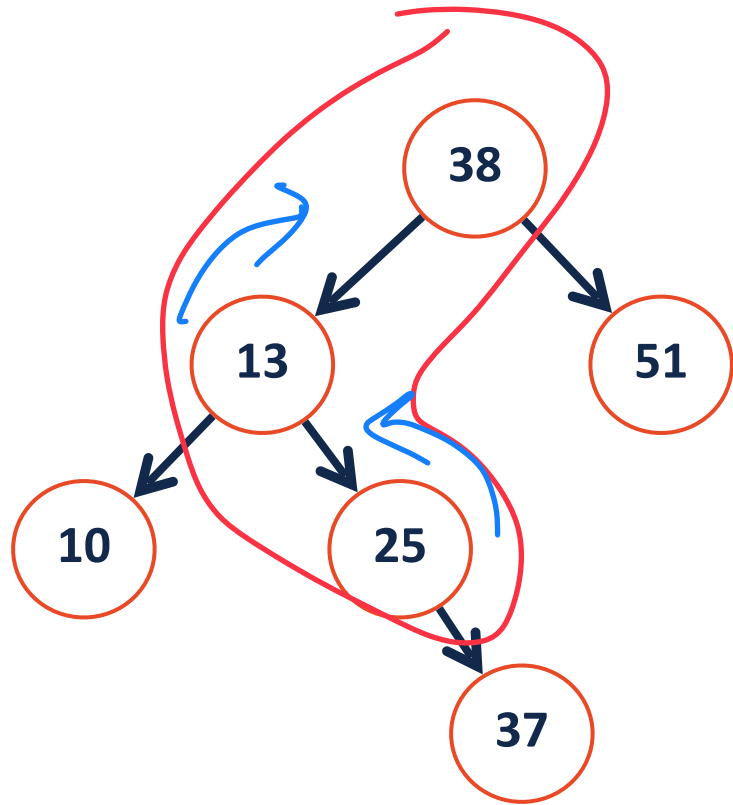
$b = -2$



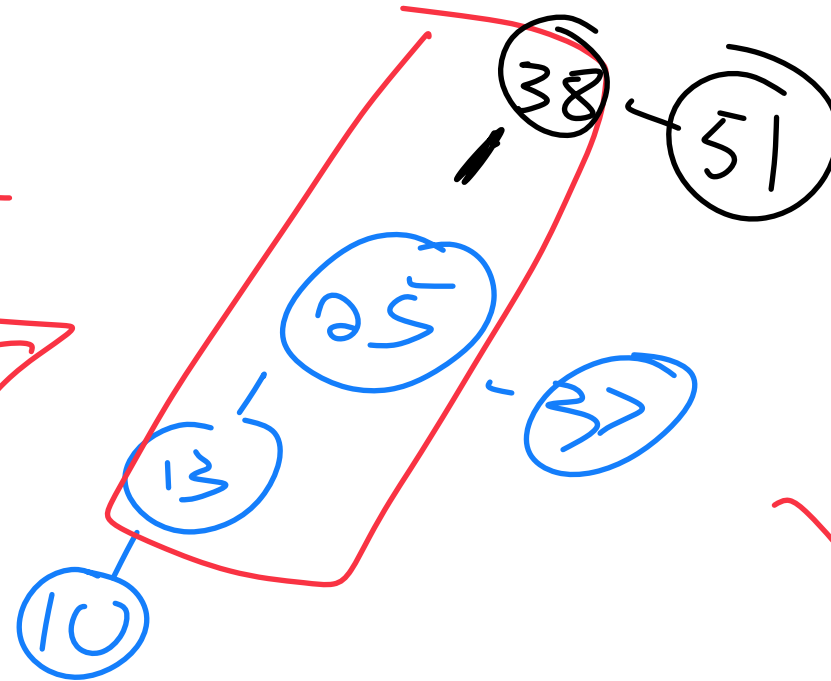
Some things not quite right...



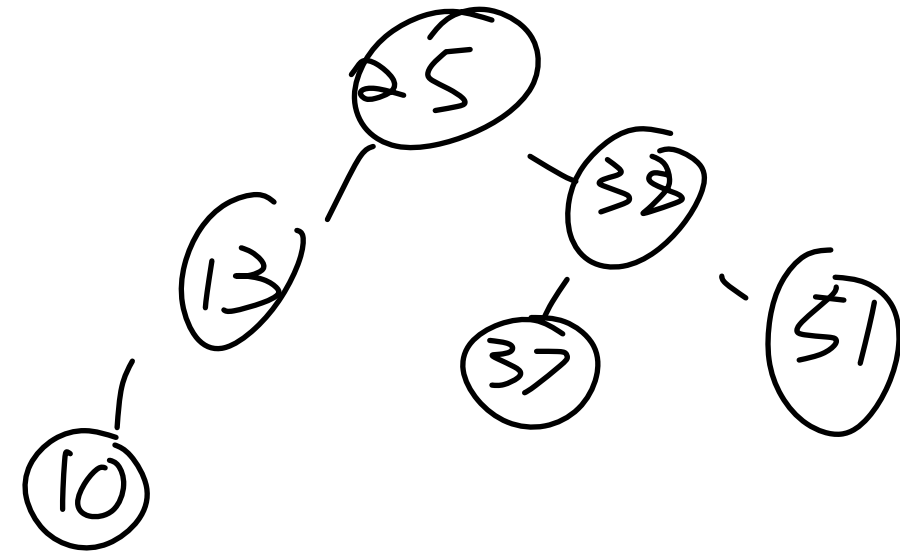
# LeftRight Rotation



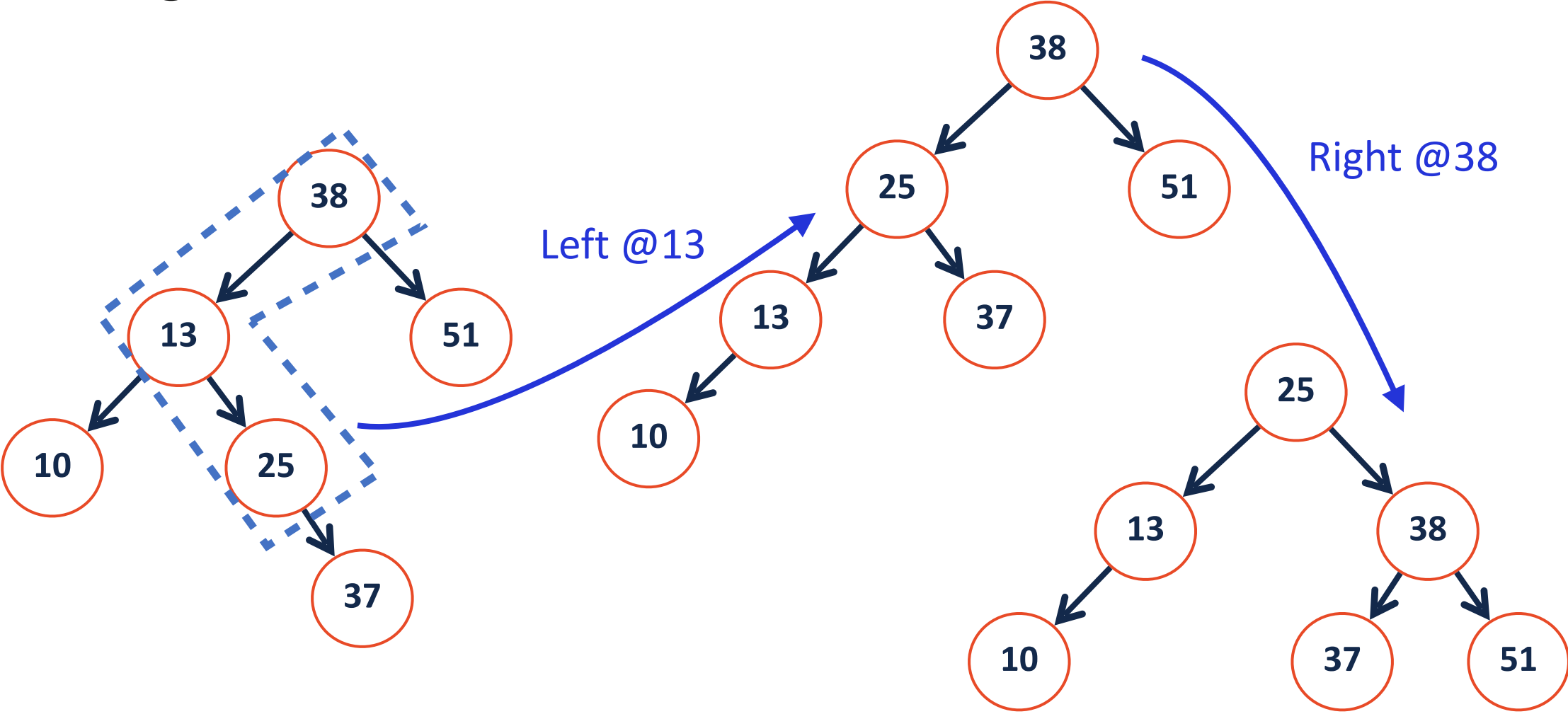
Left



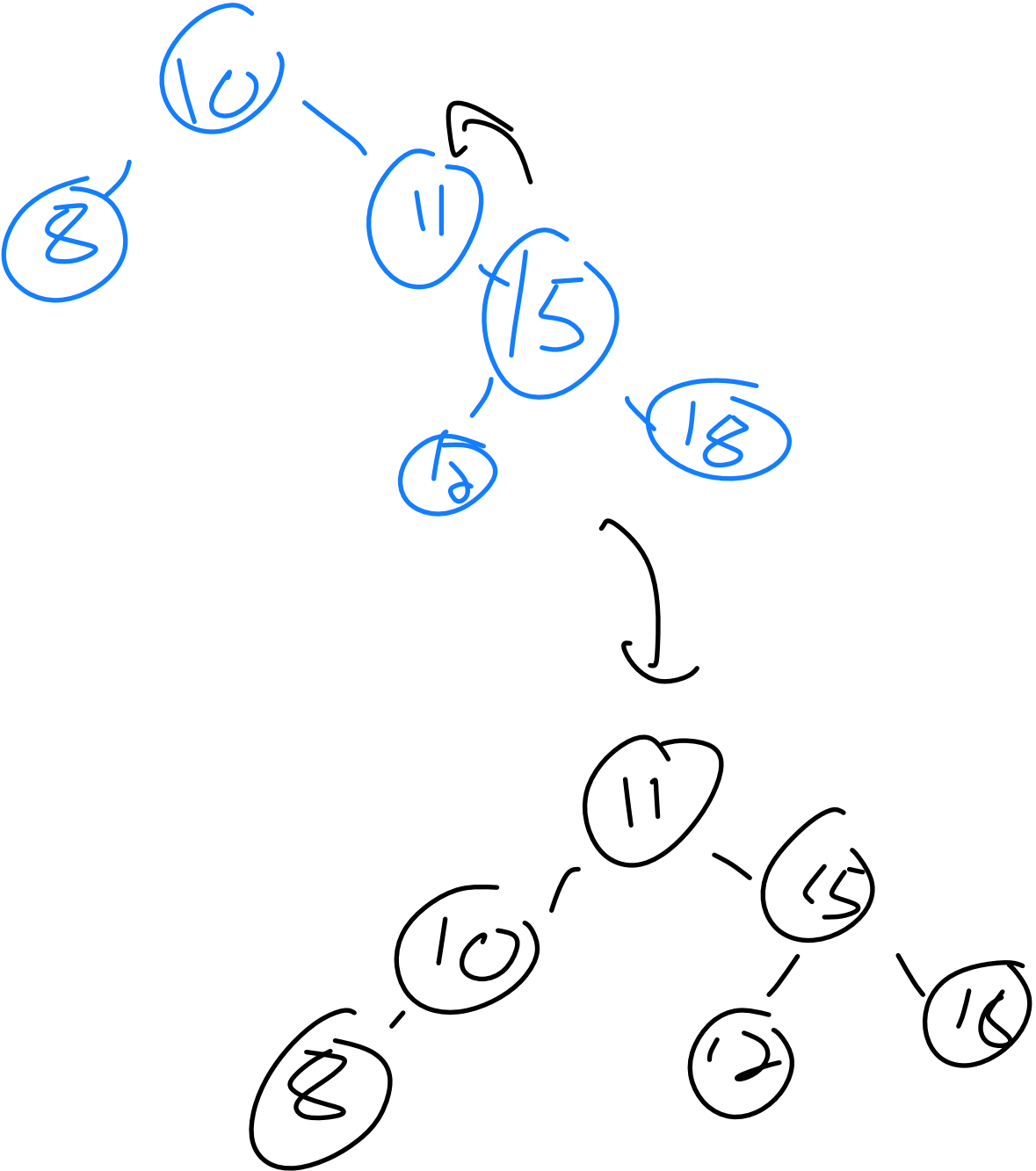
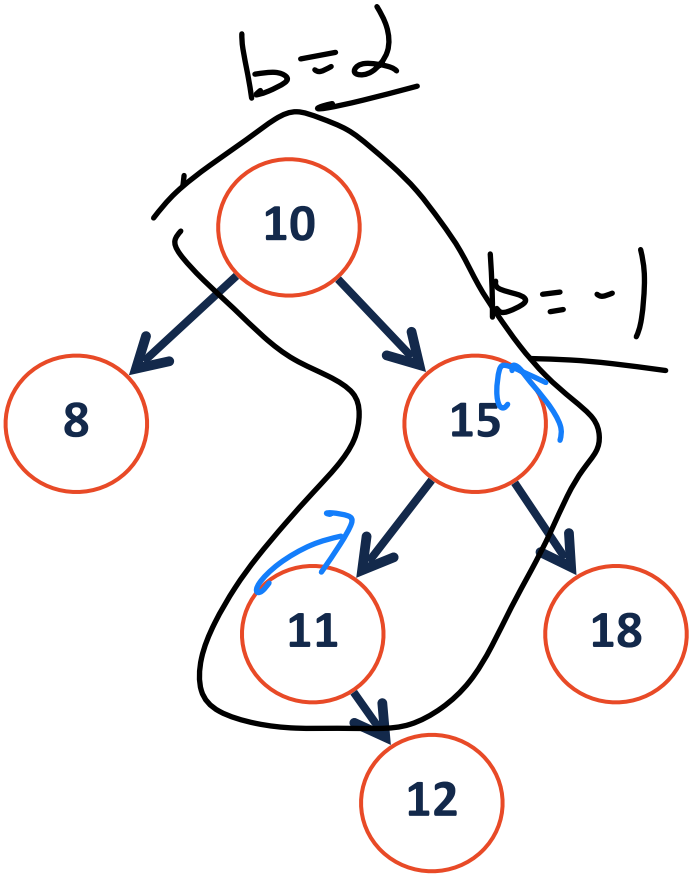
Right



# LeftRight Rotation

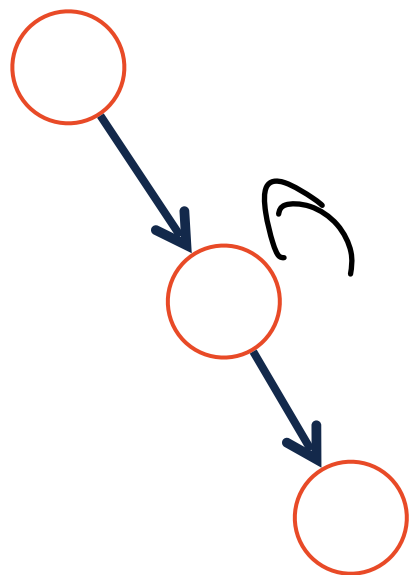


# RightLeft Rotation

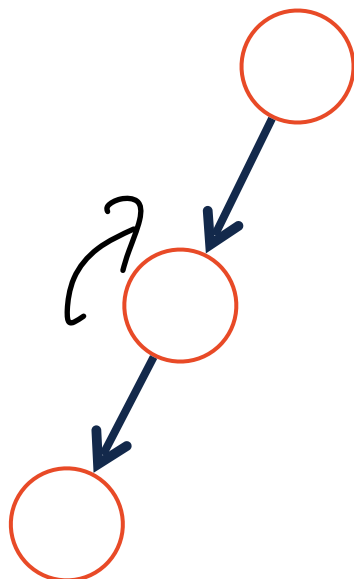


# AVL Rotations

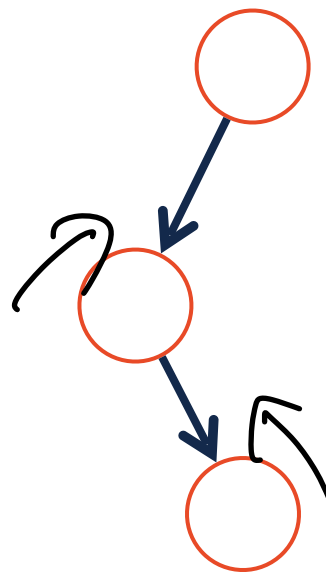
Four kinds of rotations:



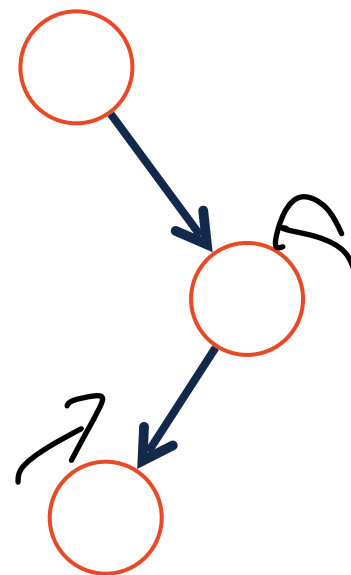
Left



Right



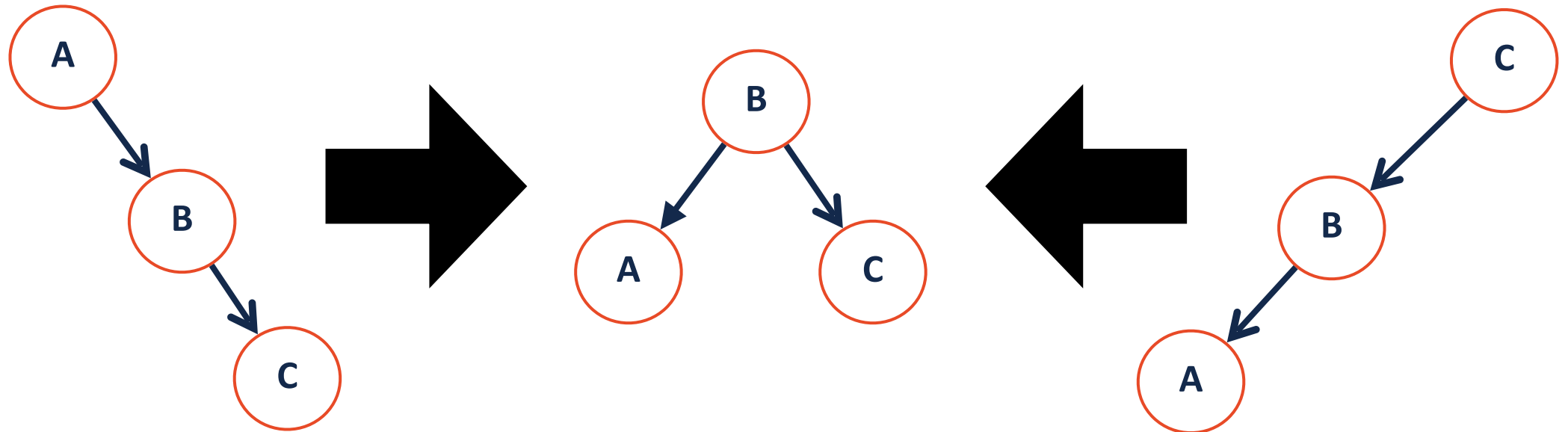
Left Right



Right Left

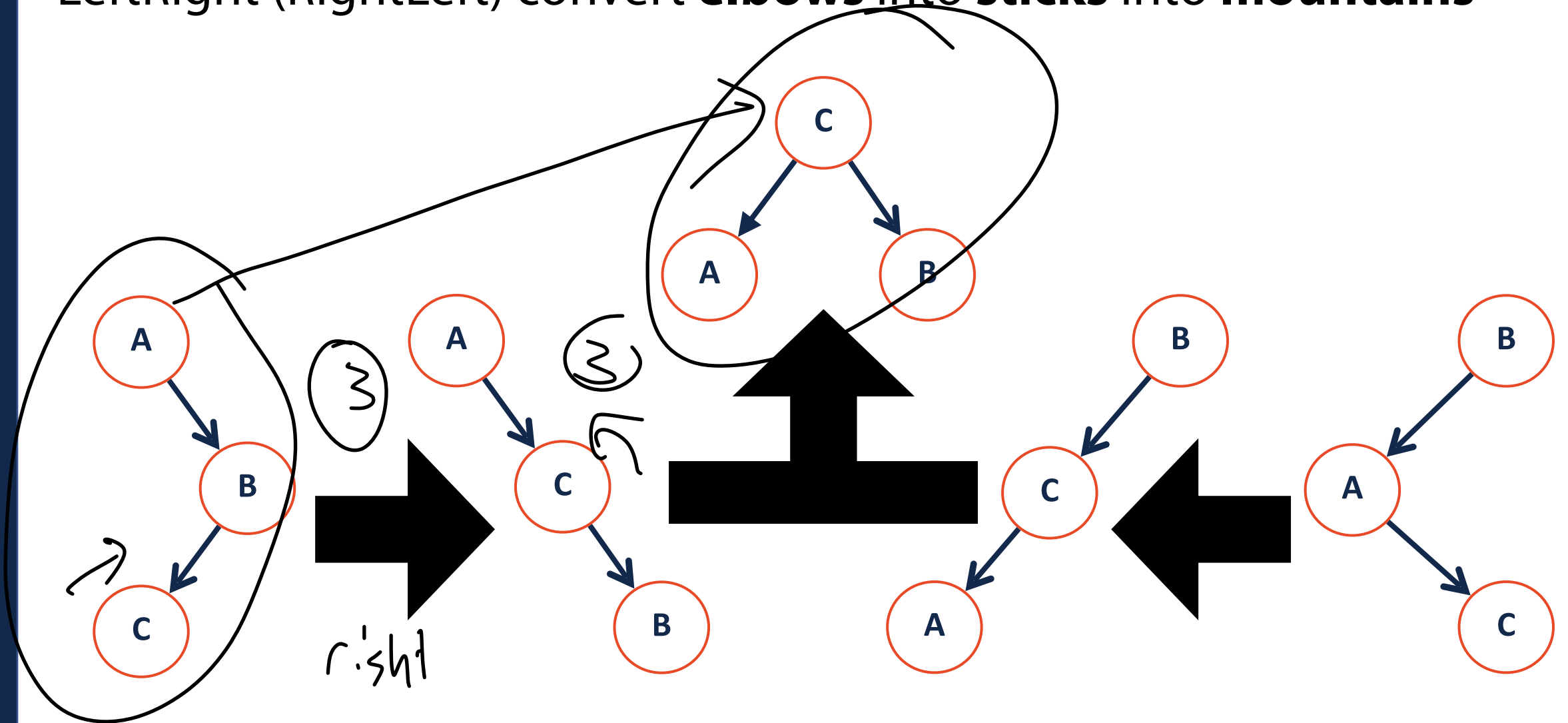
# AVL Rotations

Left and right rotation convert **sticks** into **mountains**



# AVL Rotations

LeftRight (RightLeft) convert **elbows** into **sticks** into **mountains**





# AVL Rotations

Four kinds of rotations: (L, R, LR, RL)

1. All rotations are local (subtrees are not impacted)

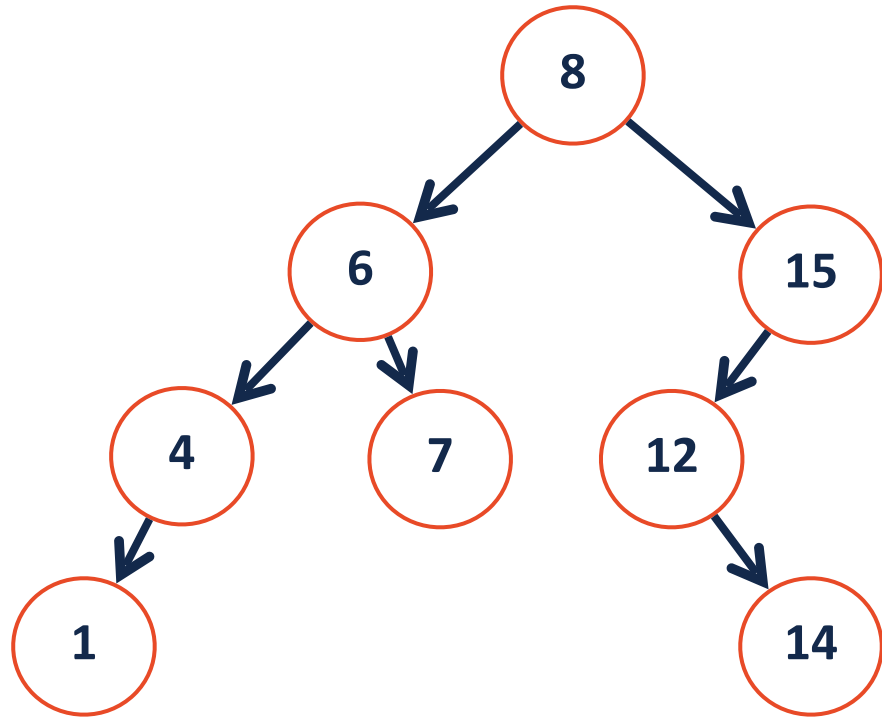


2. The running time of rotations are constant

3. The rotations maintain BST property

**Goal:** we want a height bounded BST

# AVL Rotation Practice





# AVL vs BST ADT

The AVL tree is a modified binary search tree that rotates **when necessary**

How does the constraint on balance affect the core functions?

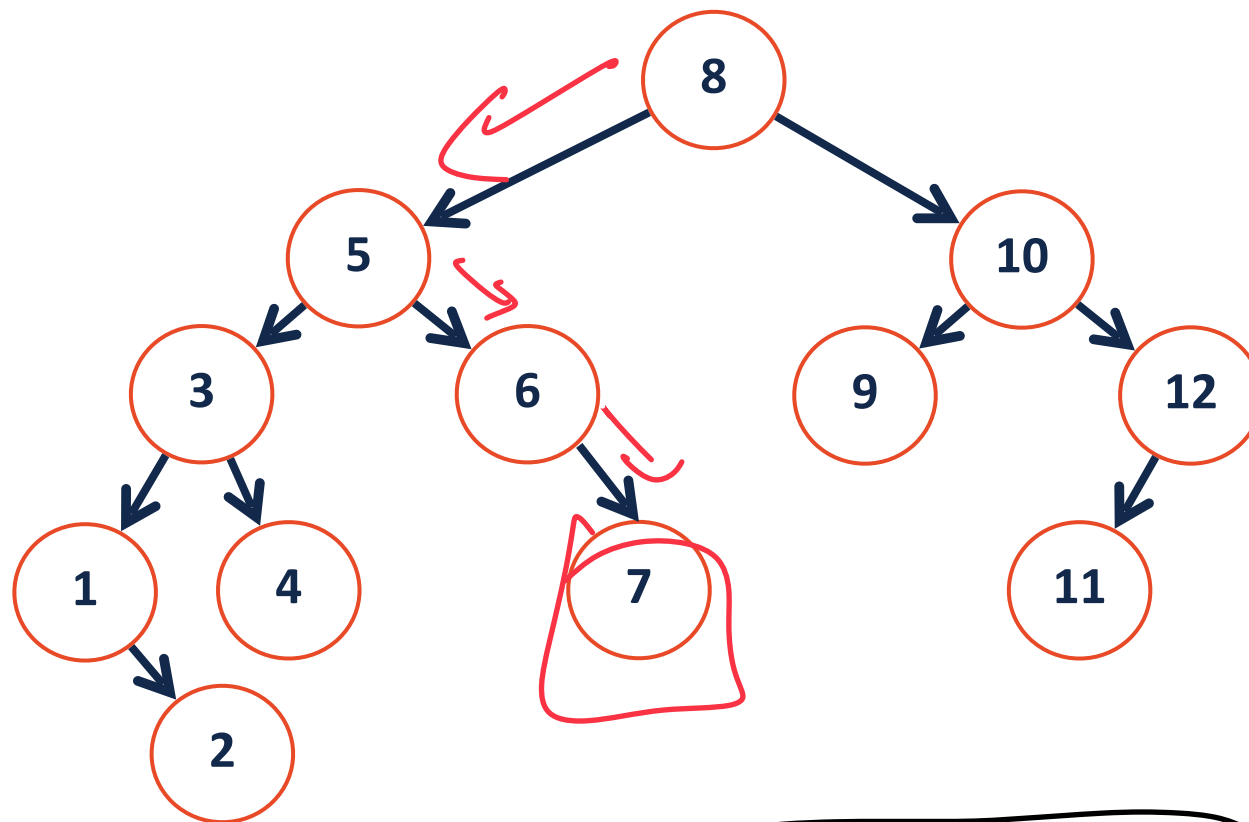
**Find**

**Insert**

**Remove**

# AVL Find

`_find(7)`



$N$  nodes = height is

$$O(\log n)$$

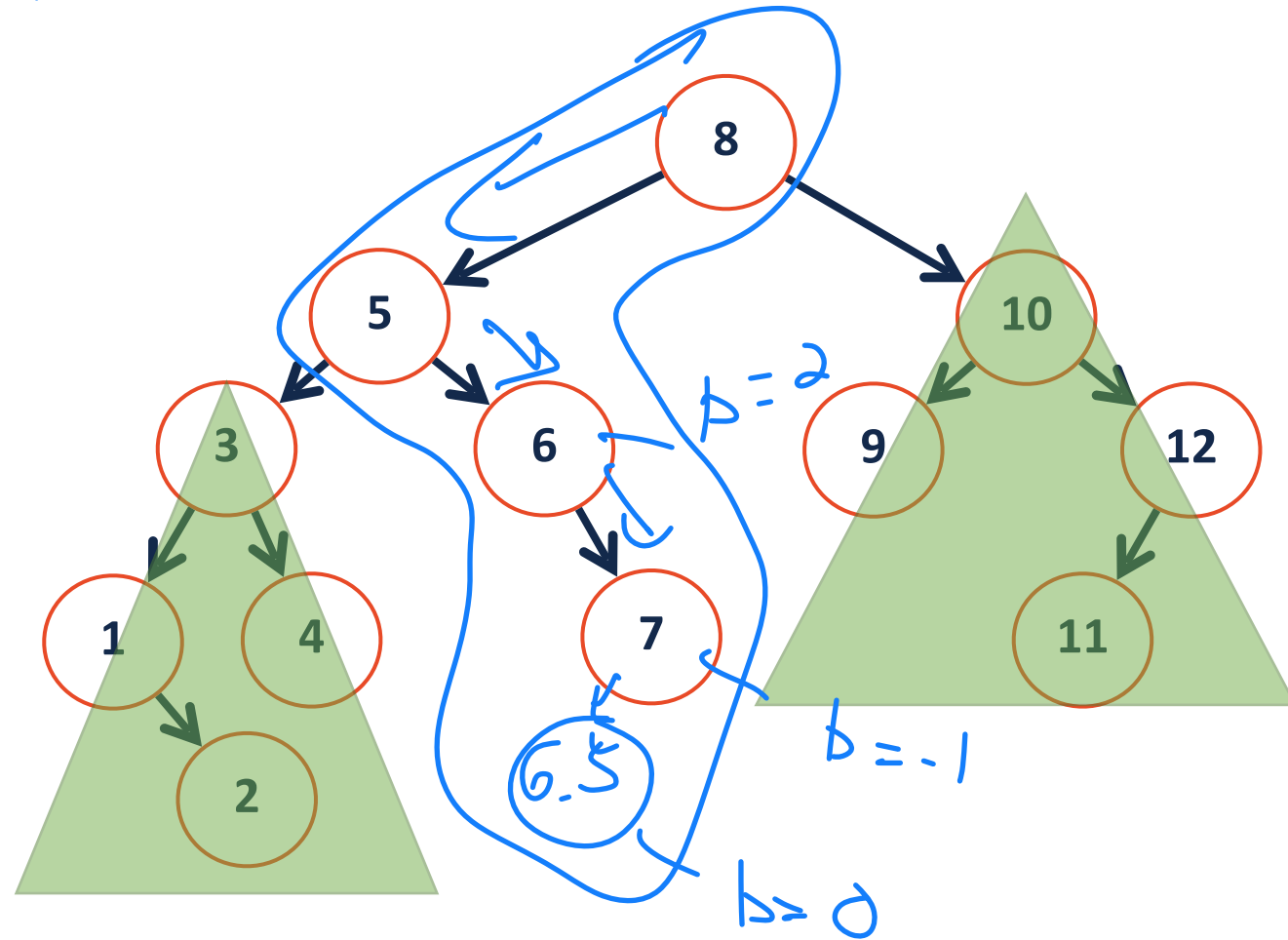
# AVL Insertion

Given AVL tree  
↳ was balanced!

`_insert(6.5)`

## Insert (pseudo code):

- 1: Insert at proper place
- 2: Check for imbalance
- 3: Rotate, if necessary



# AVL Insertion

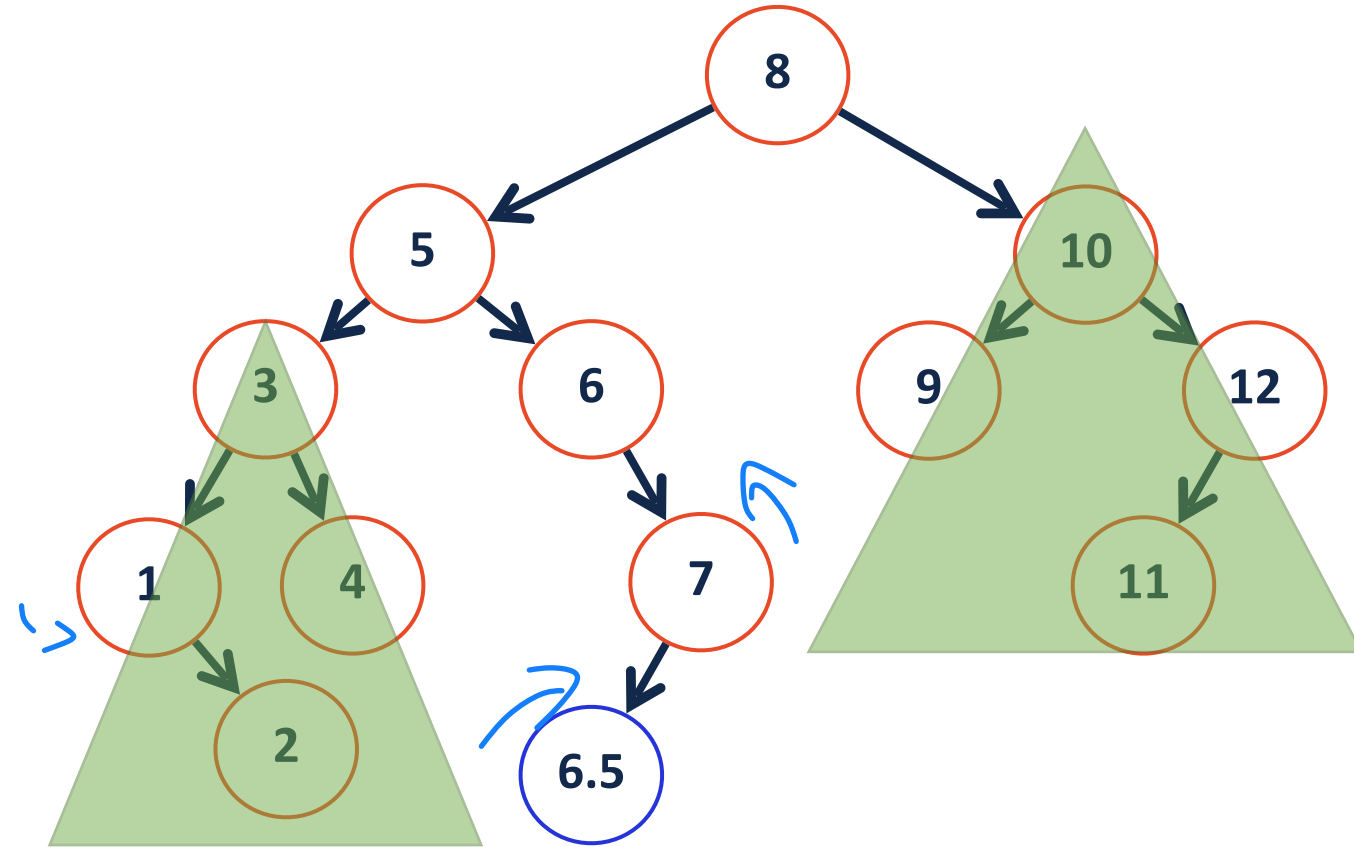
`_insert(6.5)`

## Insert (pseudo code):

- 1: Insert at proper place
- 2: Check for imbalance
- 3: Rotate, if necessary

6 ← 6.5 →

6 ← 6.5 →

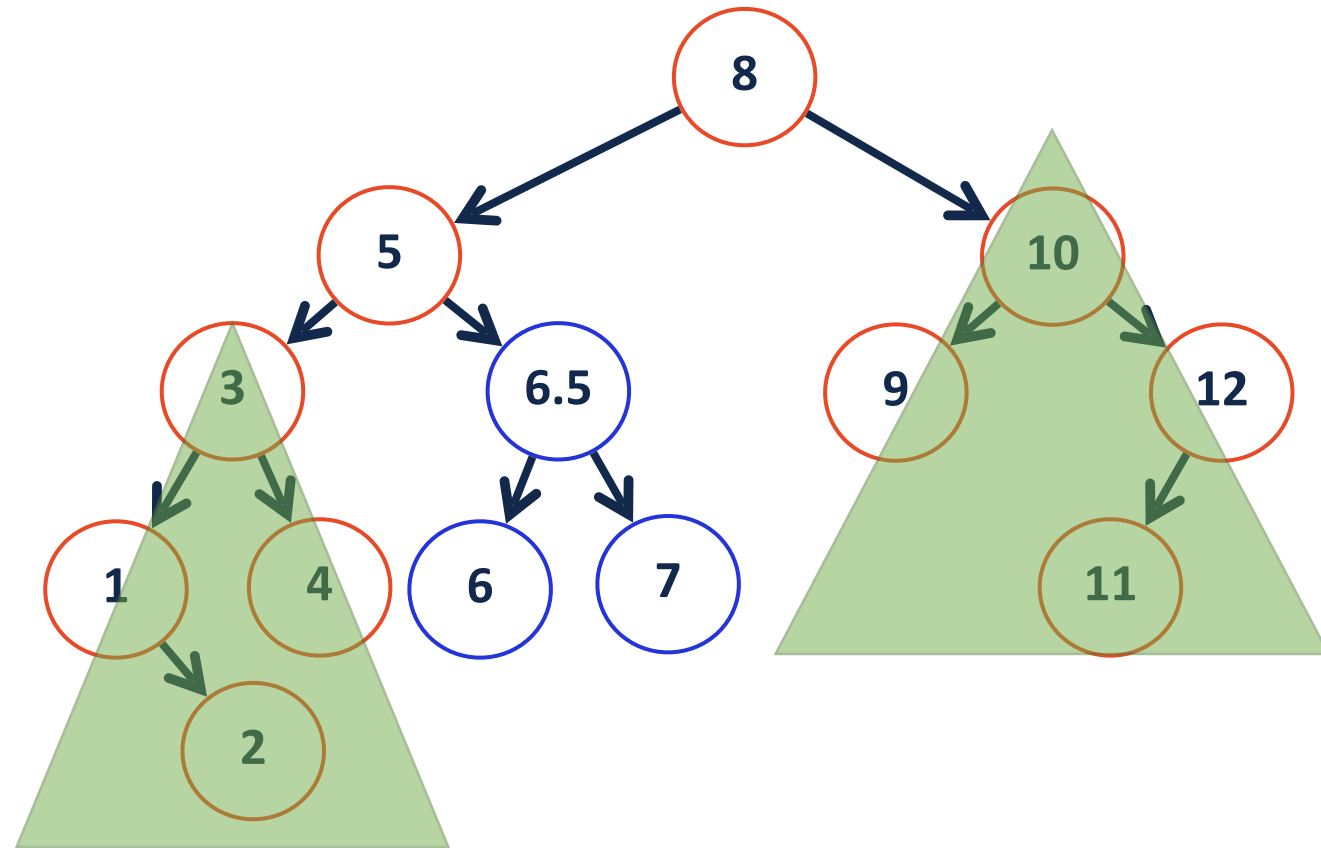


# AVL Insertion

`_insert(6.5)`

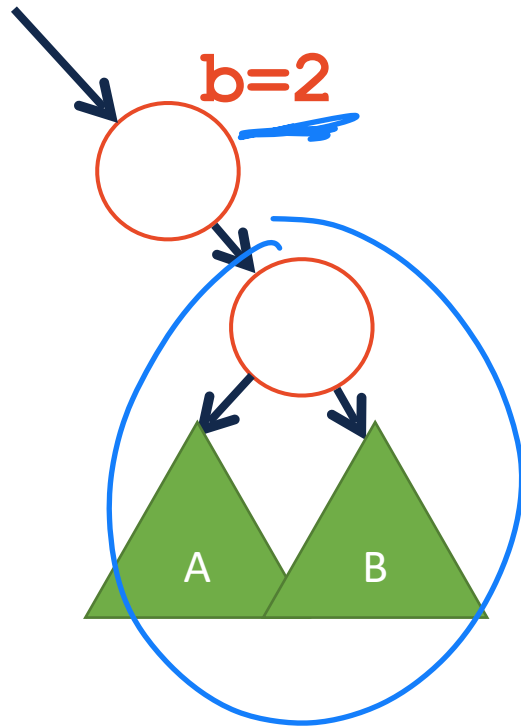
## Insert (pseudo code):

- 1: Insert at proper place
- 2: Check for imbalance
- 3: Rotate, if necessary



# AVL Insertion — what rotation to call for what insert

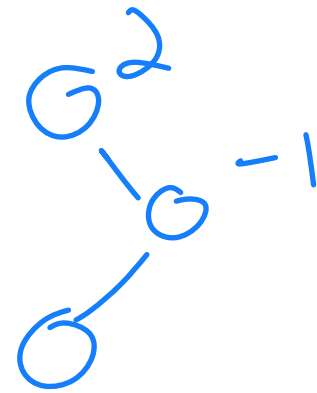
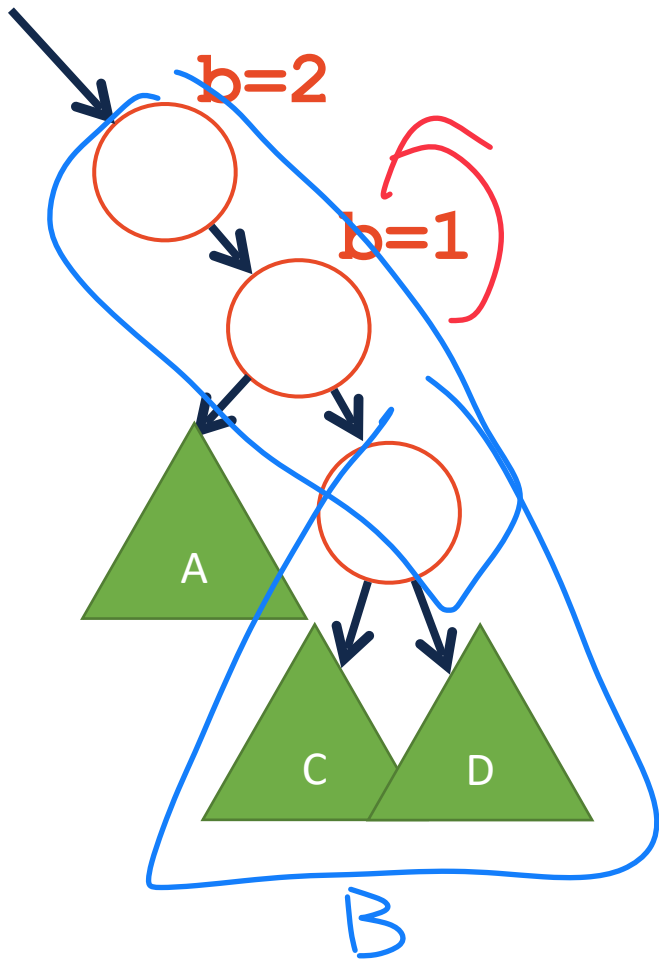
Given an AVL is balanced, insert can insert **at most** one imbalance



# AVL Insertion

If we insert in B, I must have a balance pattern of **2, 1**

Conceptual point: (+) #s are right heavy

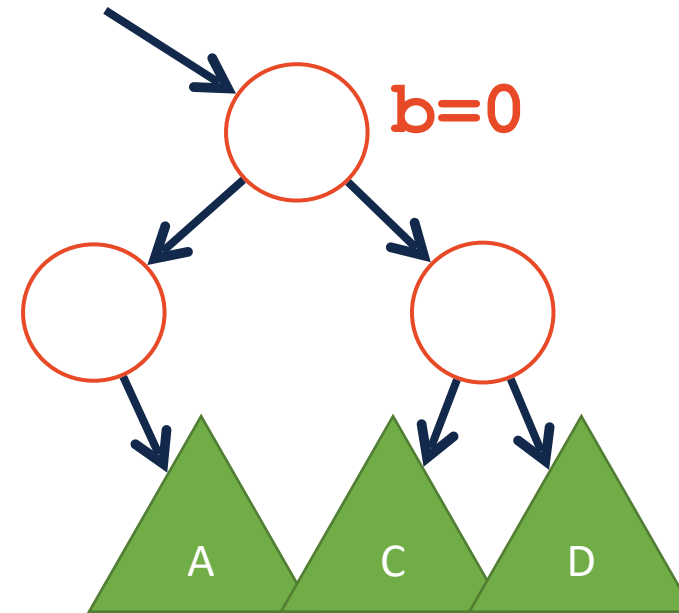
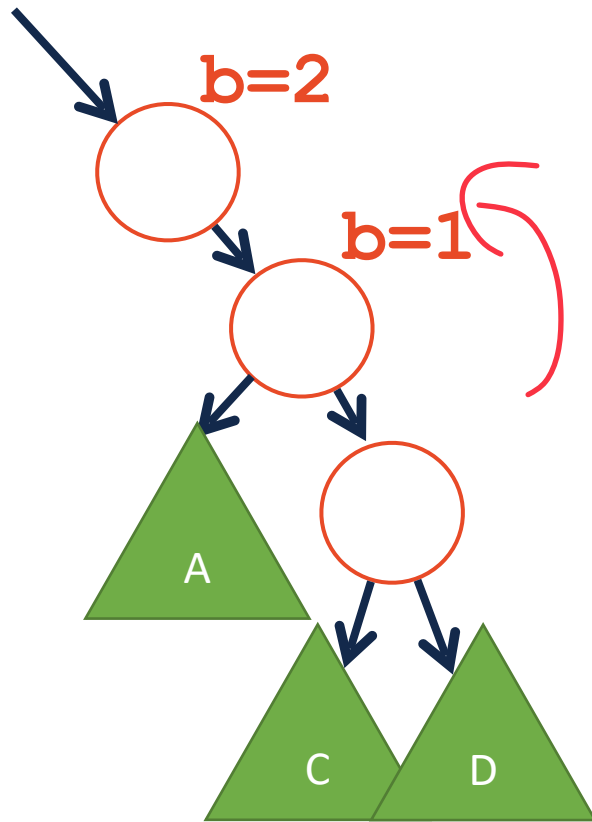


Right heavy in right direction

↳ Left rotation

# AVL Insertion

A **left** rotation fixes our imbalance in our local tree.



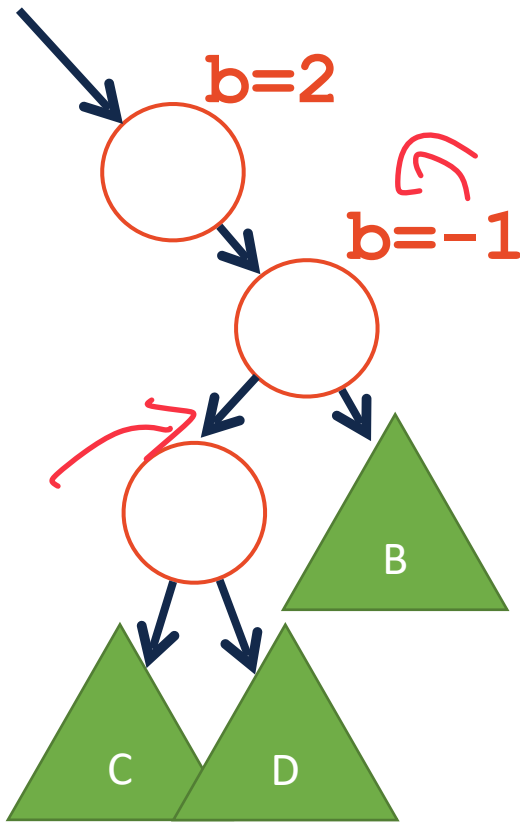
After rotation, subtree has **pre-insert height**. (Overall tree is balanced)



# AVL Insertion

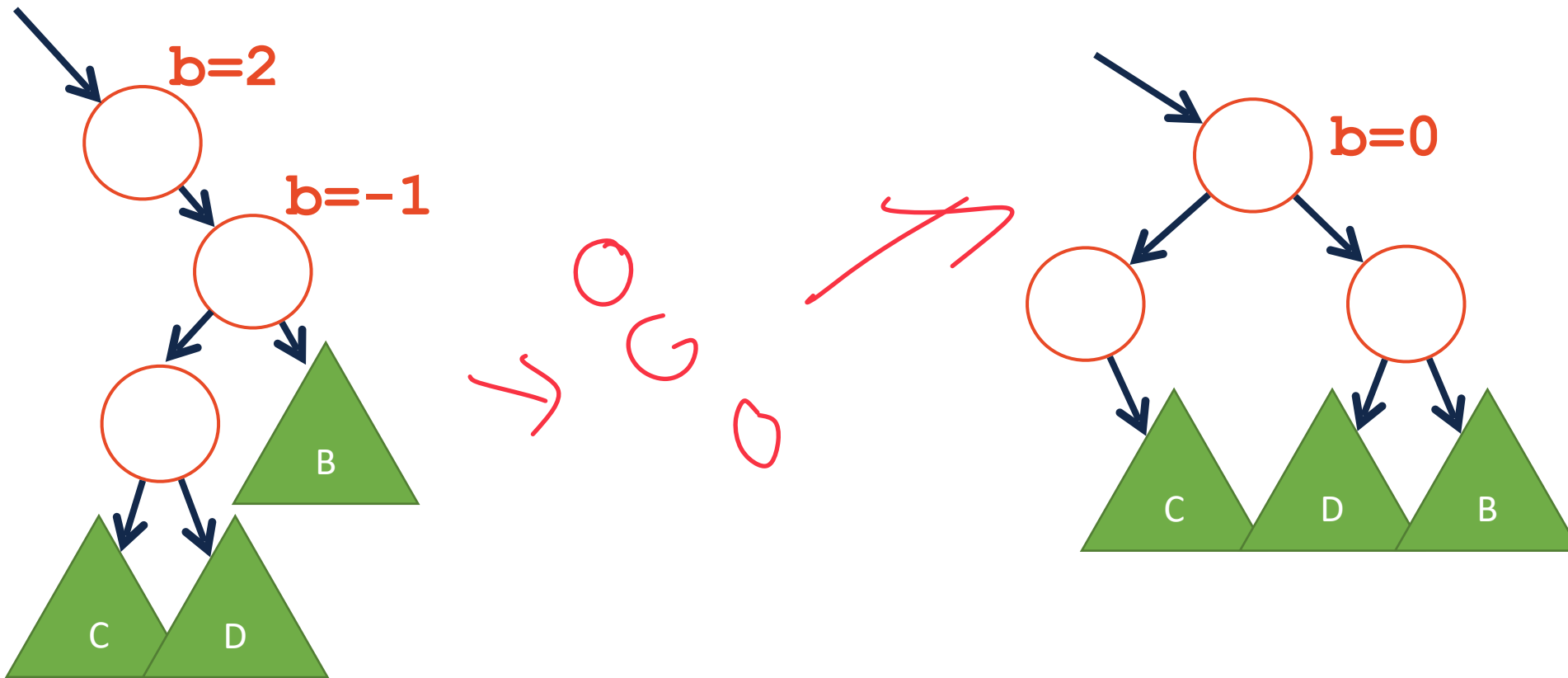
If we insert in A, I must have a balance pattern of **2, -1**

*2, -1 → right left*



# AVL Insertion

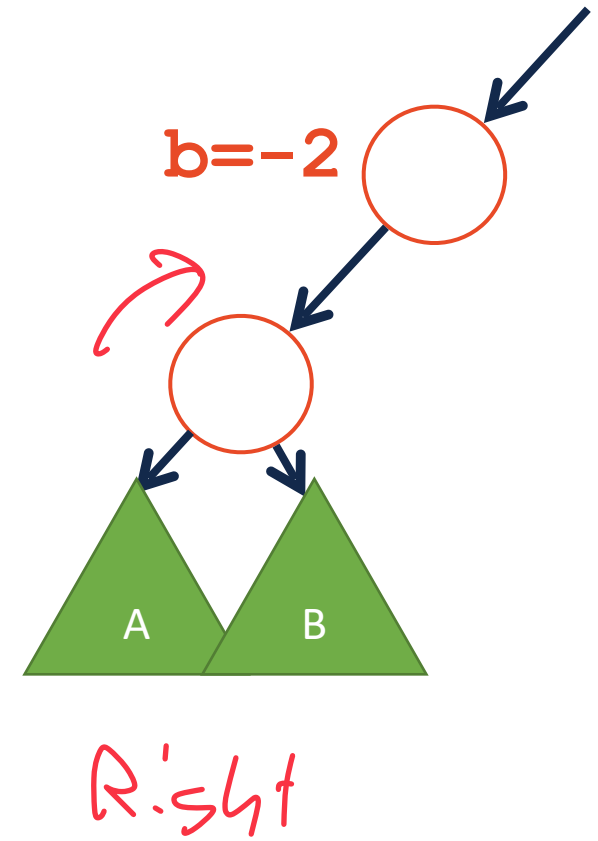
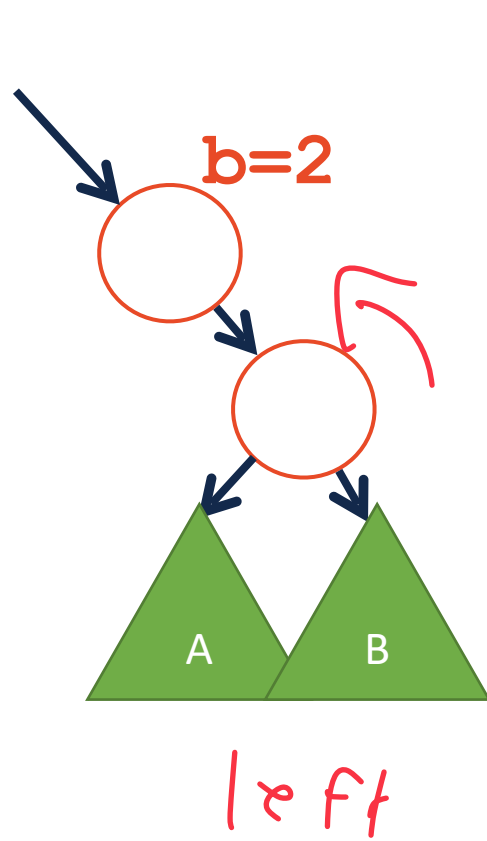
A **rightLeft** rotation fixes our imbalance in our local tree.



After rotation, subtree has **pre-insert height**. (Overall tree is balanced)

# AVL Insertion

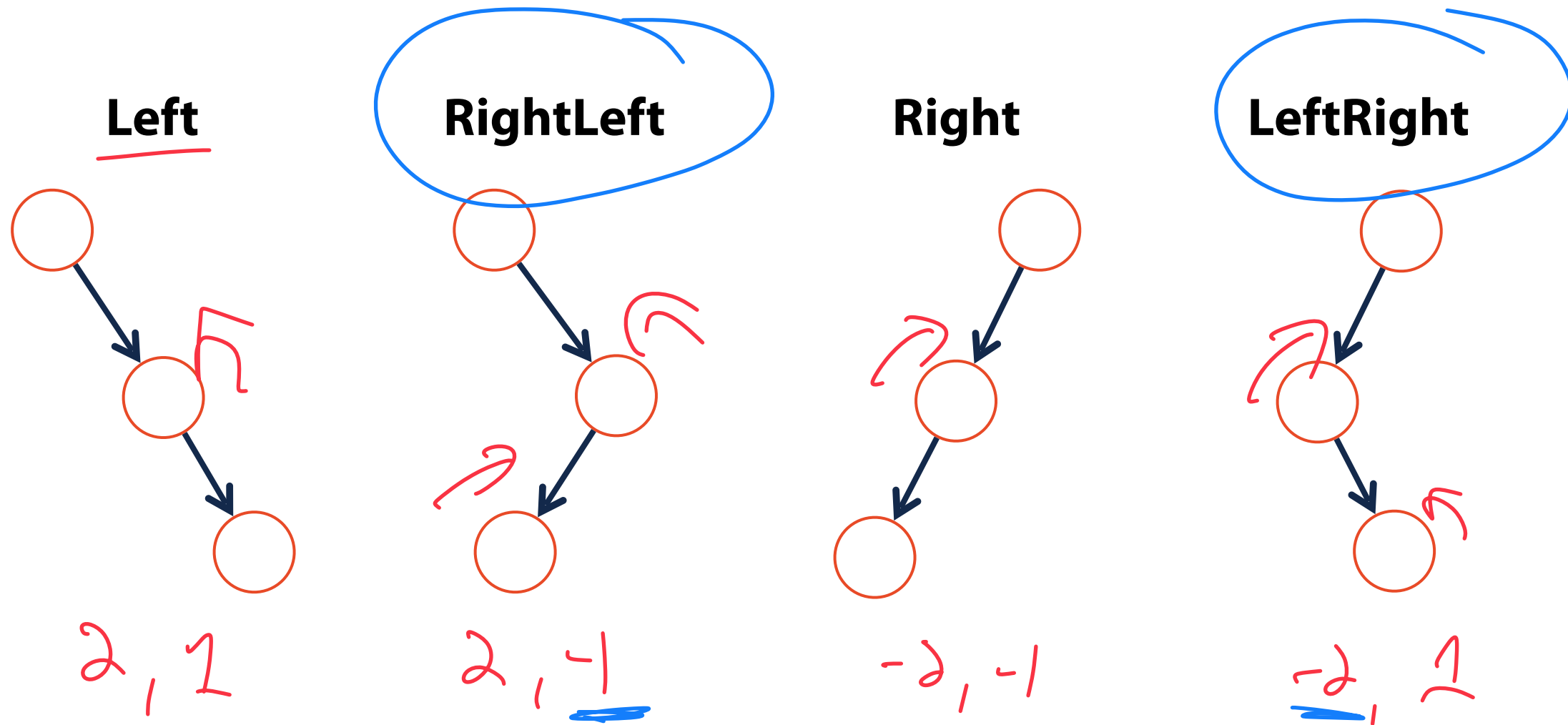
The other rotations are a direct mirror:



# AVL Insertion

(+) is right

If we know our imbalance direction, we can call the correct rotation.





# AVL Insertion

Insert *may* increase height by at most:

A rotation reduces the height of the subtree by:

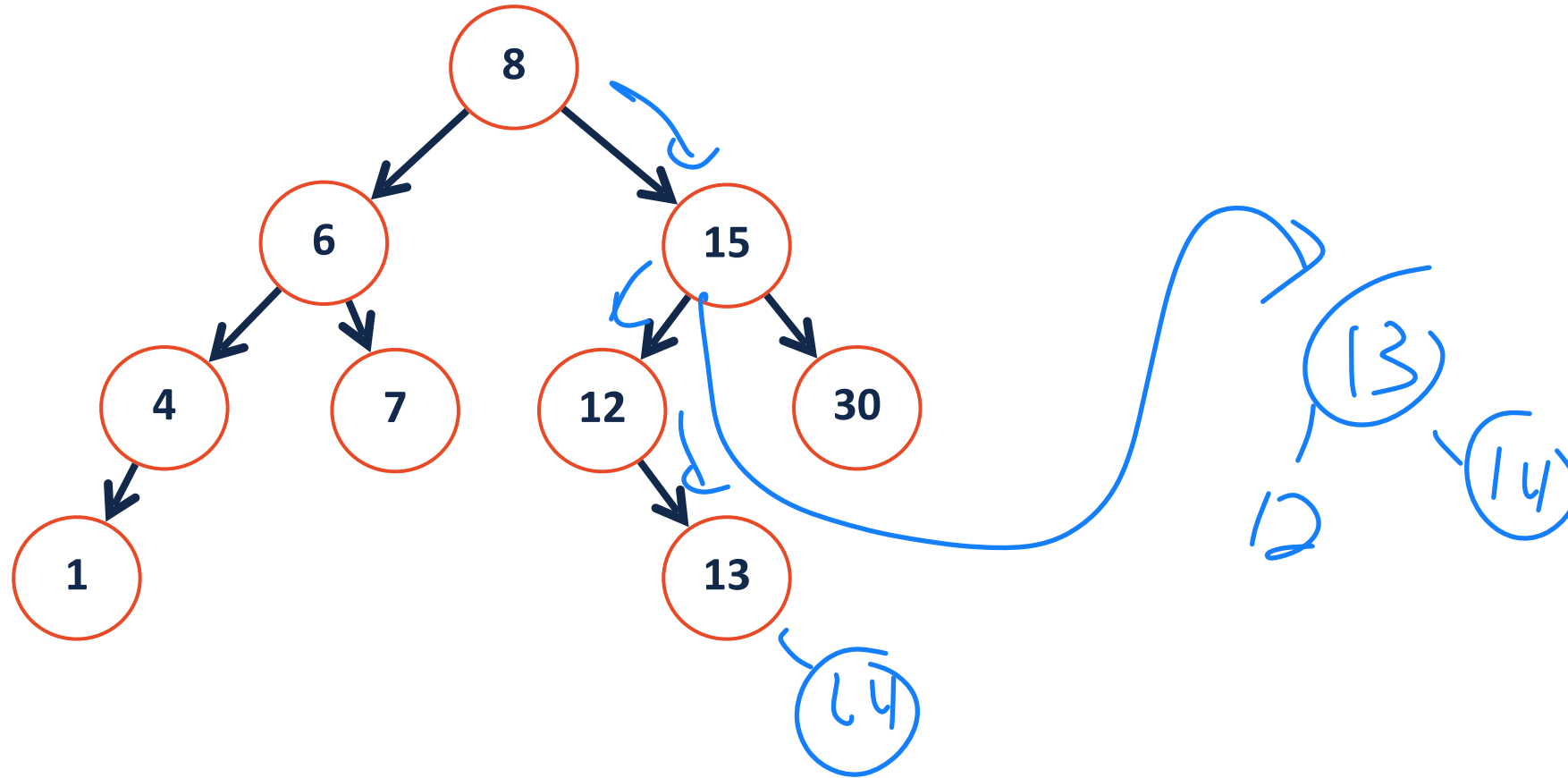
**A single\* rotation restores balance and corrects height!**

What is the Big O of performing our rotation?  $O(1)$

What is the Big O of insert?  $O(\log n)$

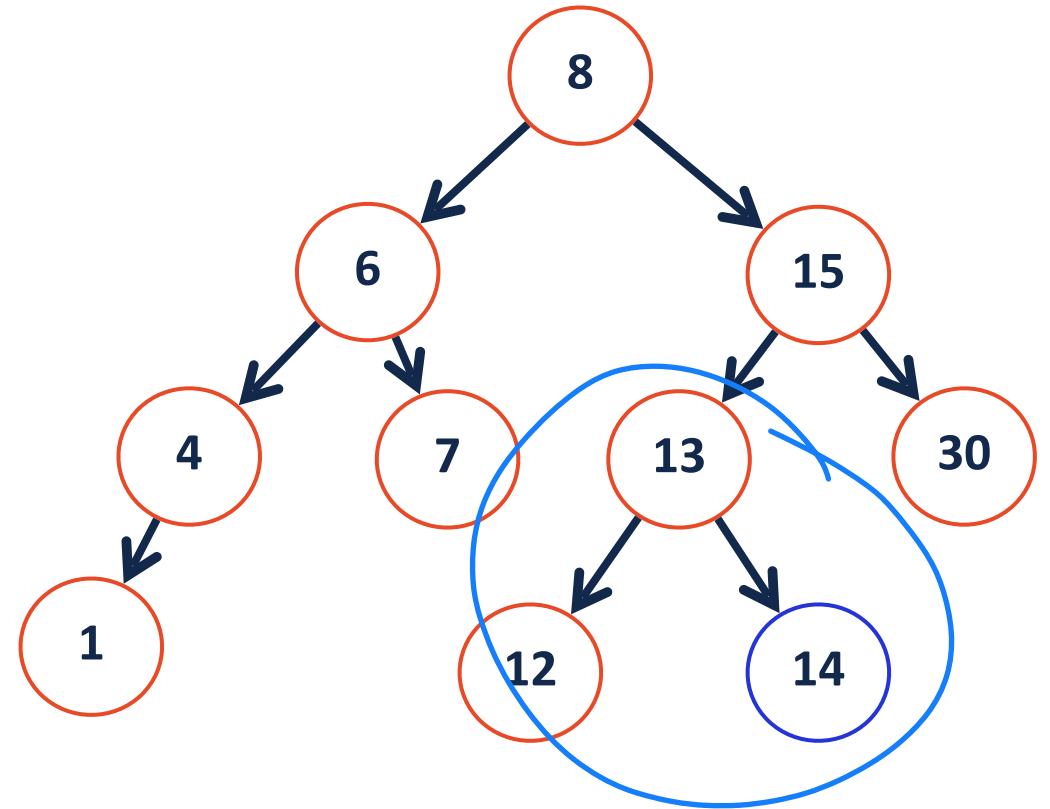
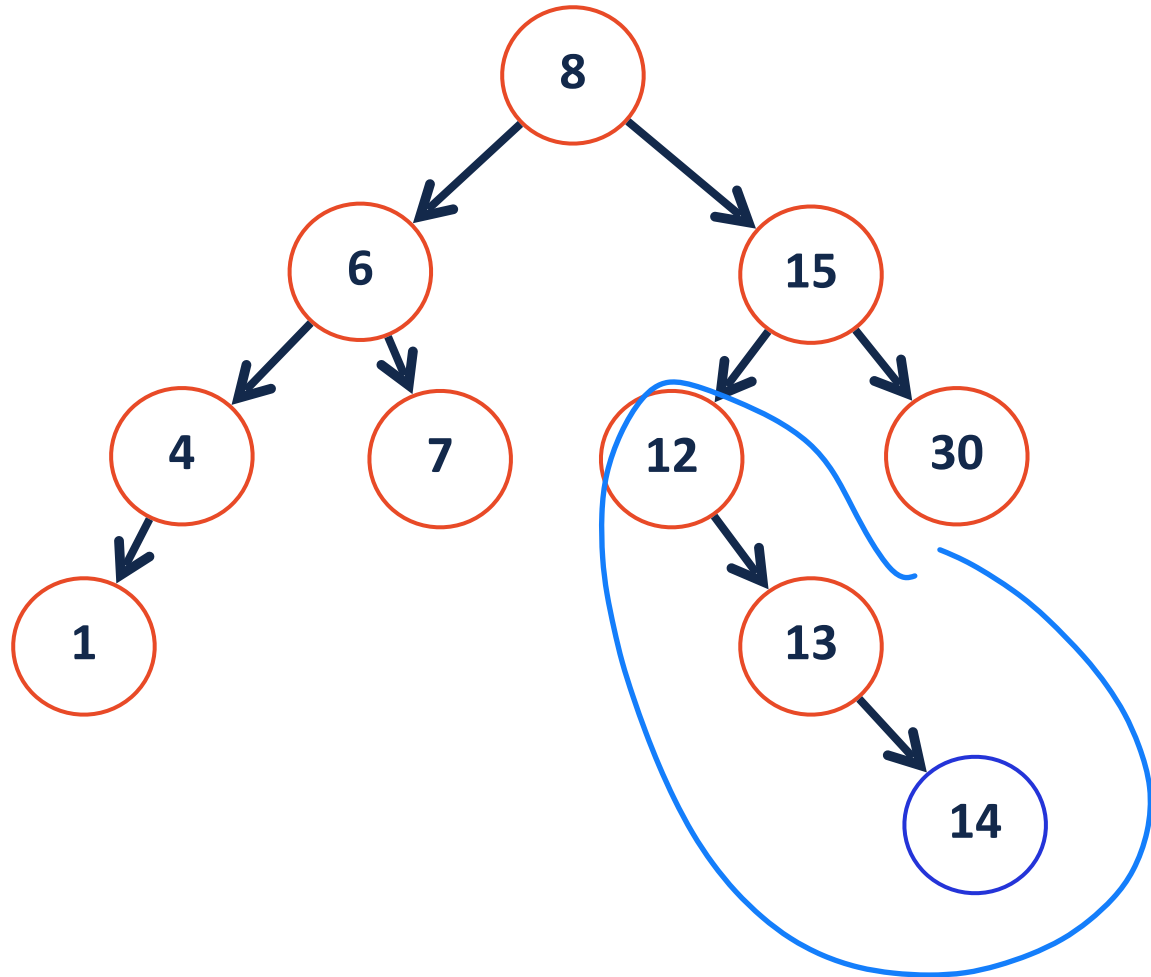
# AVL Insertion Practice

insert(14)



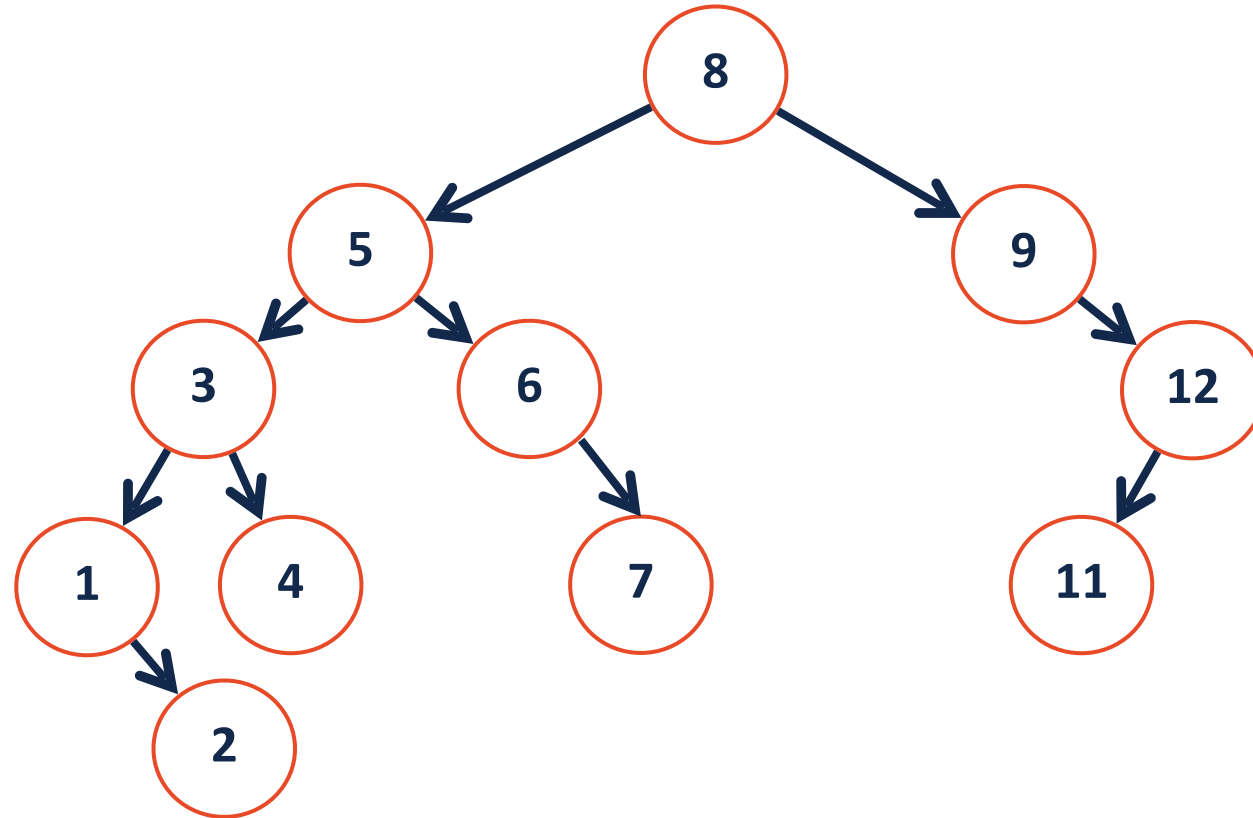
# AVL Insertion Practice

`_insert(14)`



# AVL Remove

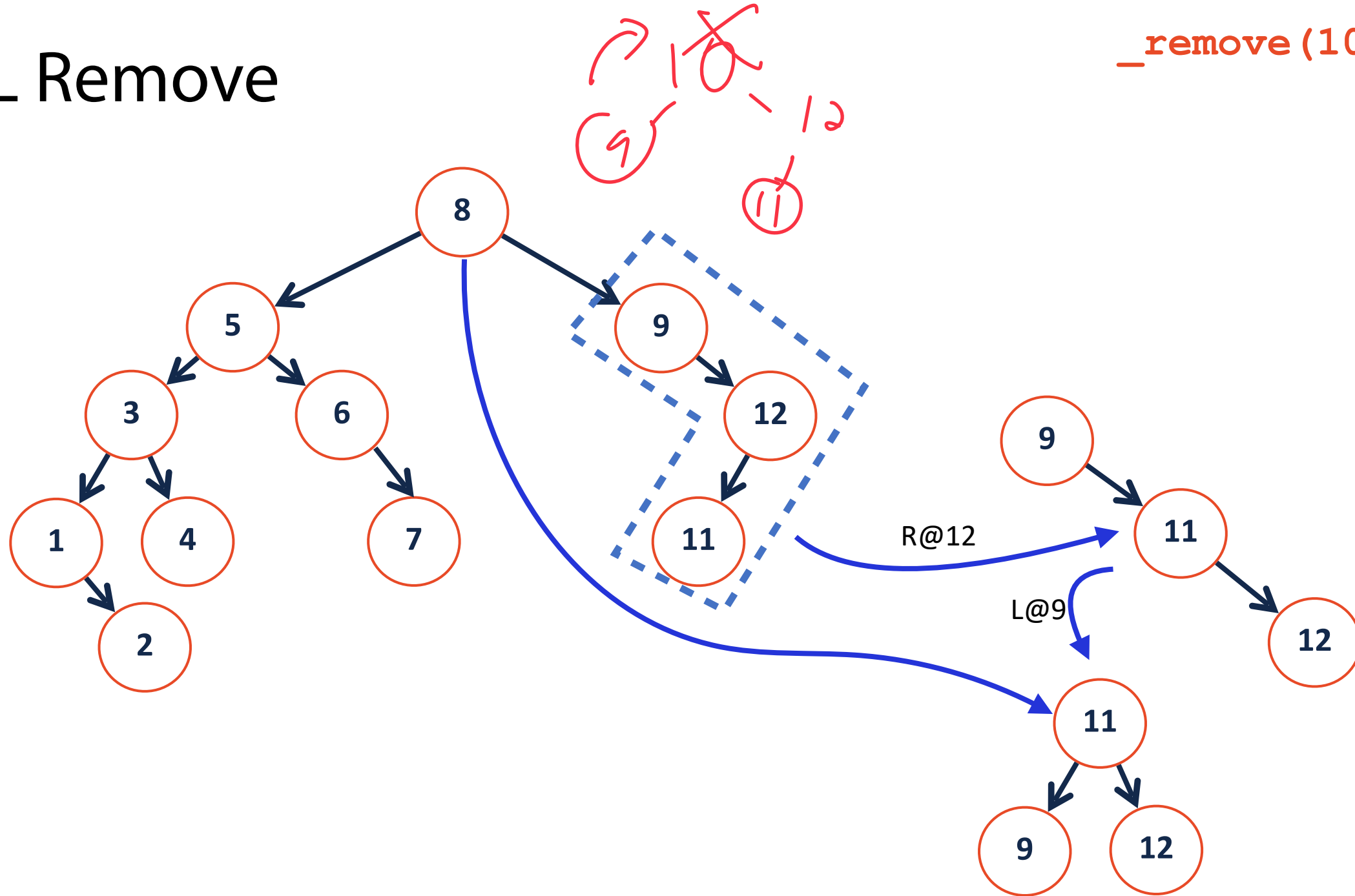
`_remove(10)`





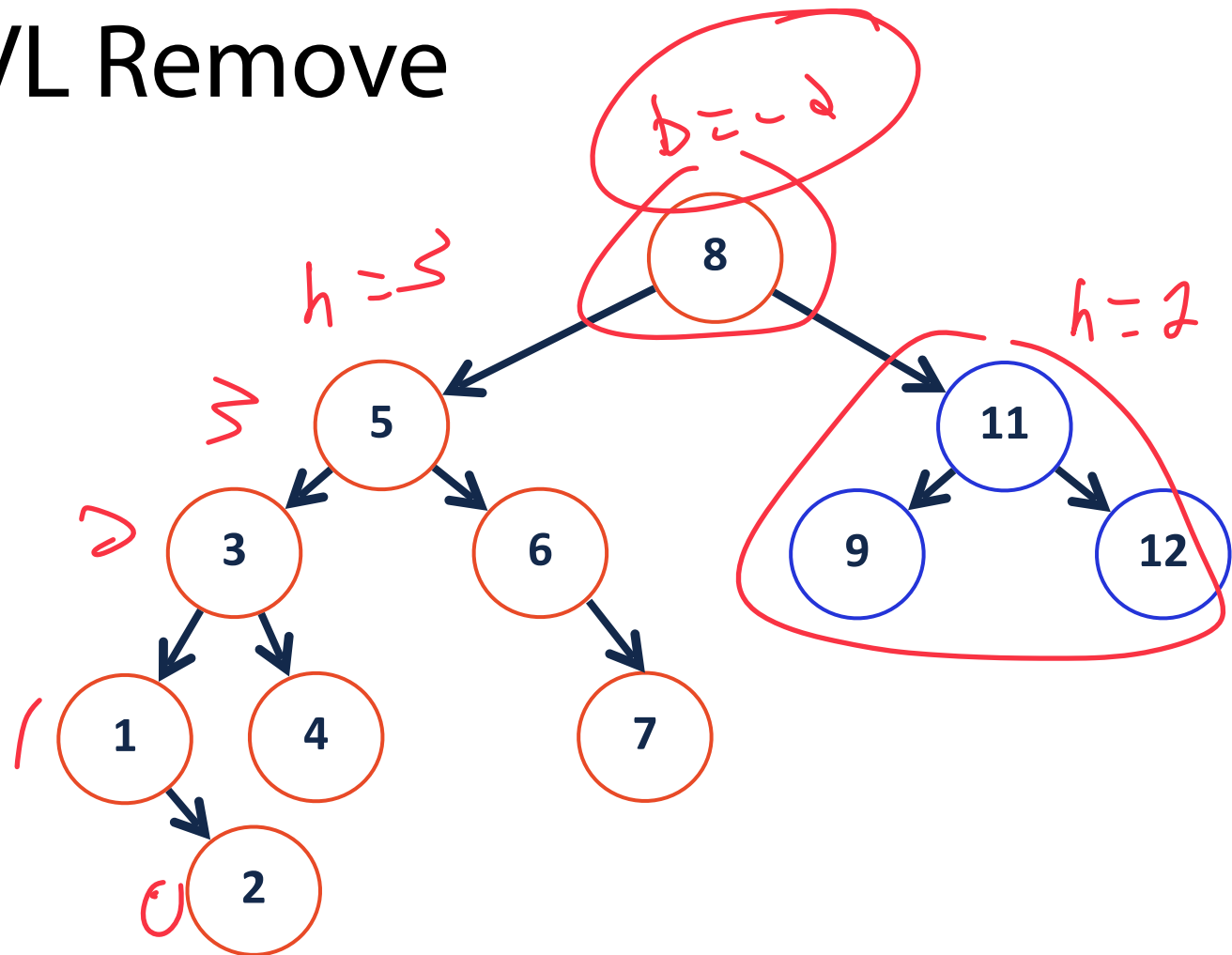
# AVL Remove

`_remove(10)`



# AVL Remove

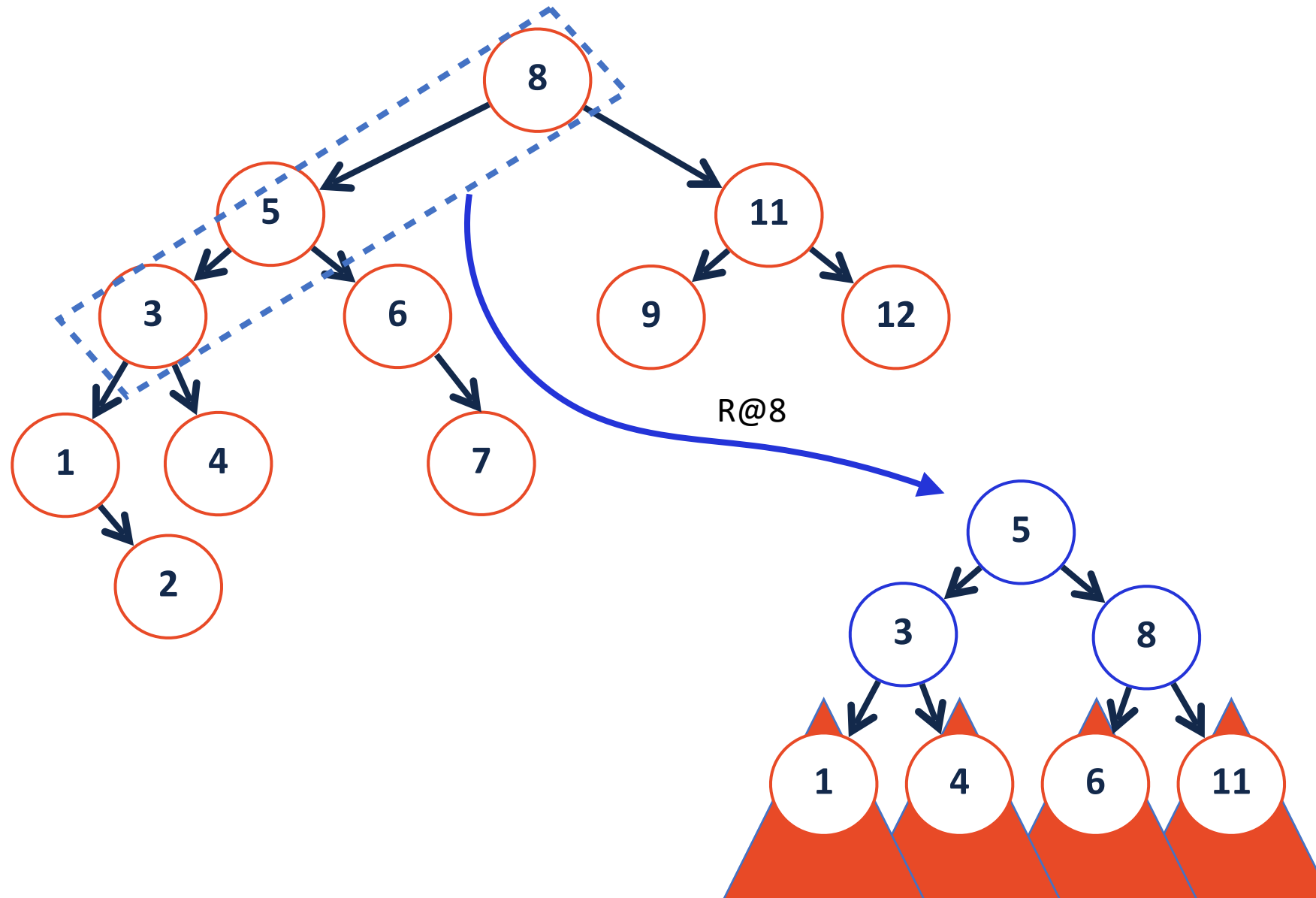
`_remove(10)`



$$7 - 3 = -2$$

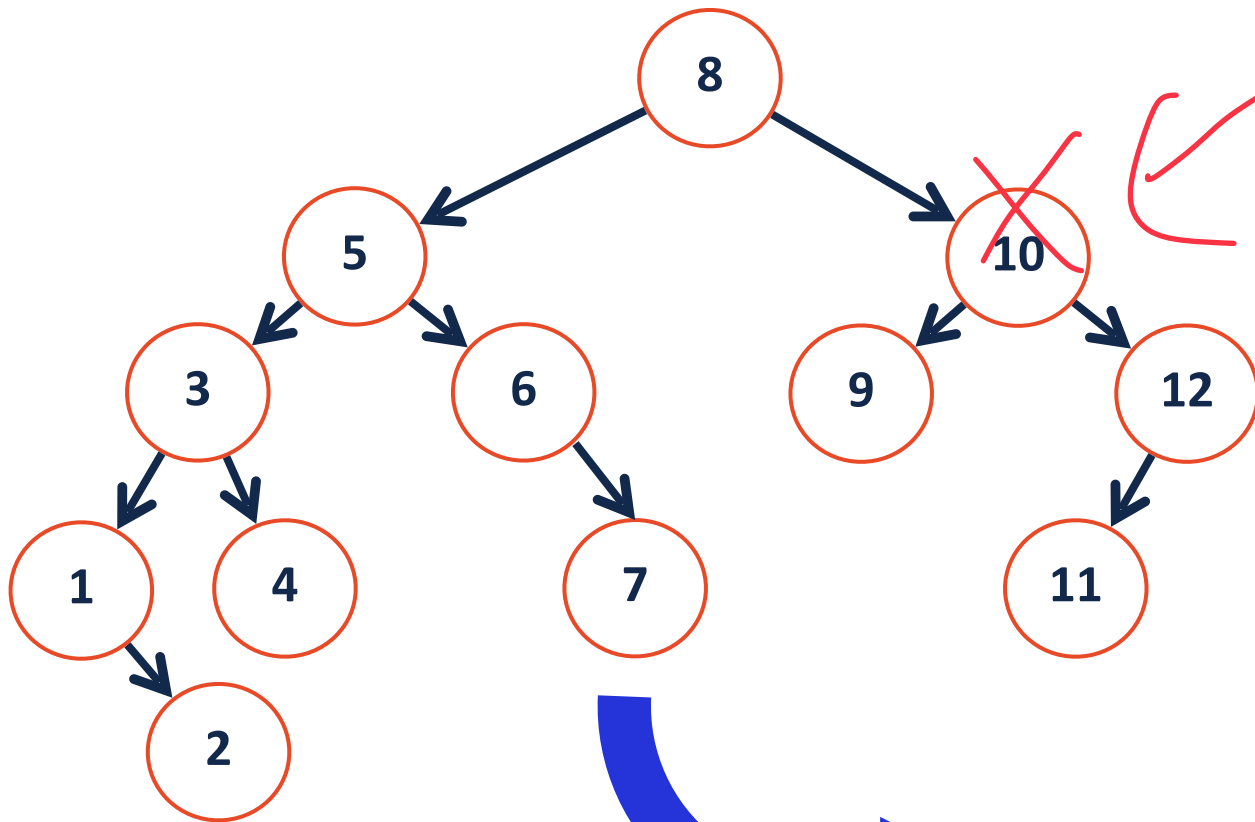
# AVL Remove

`_remove(10)`

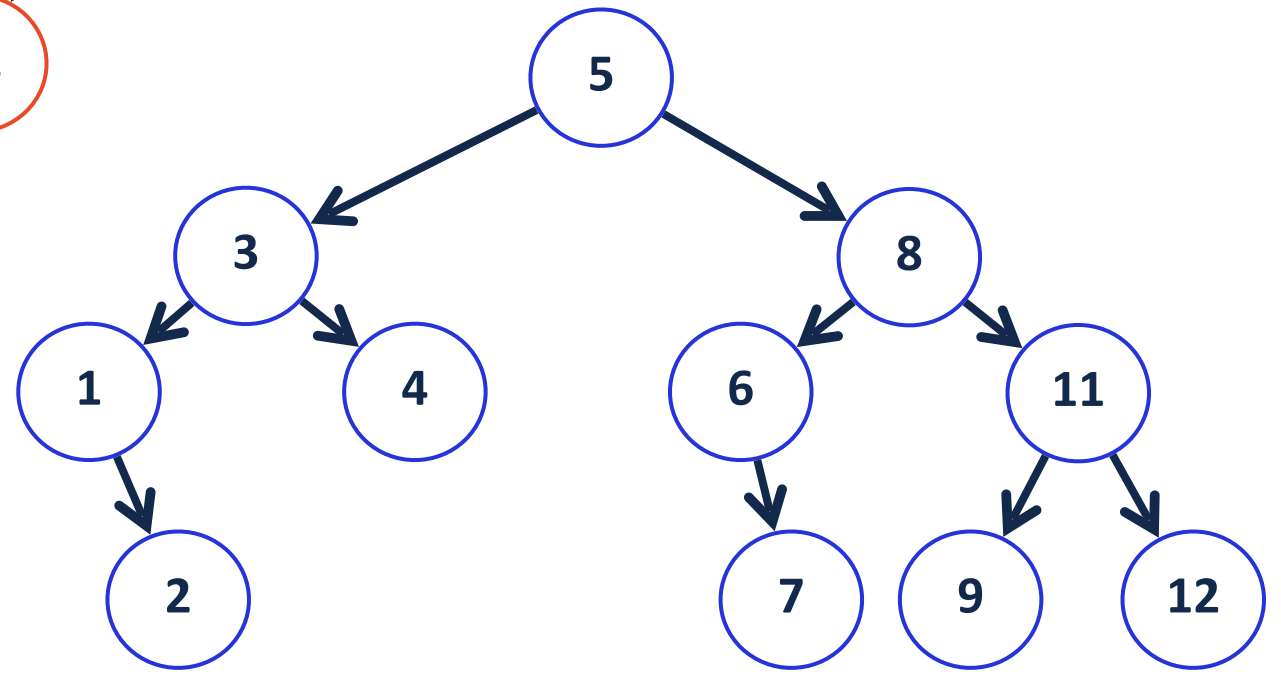


# AVL Remove

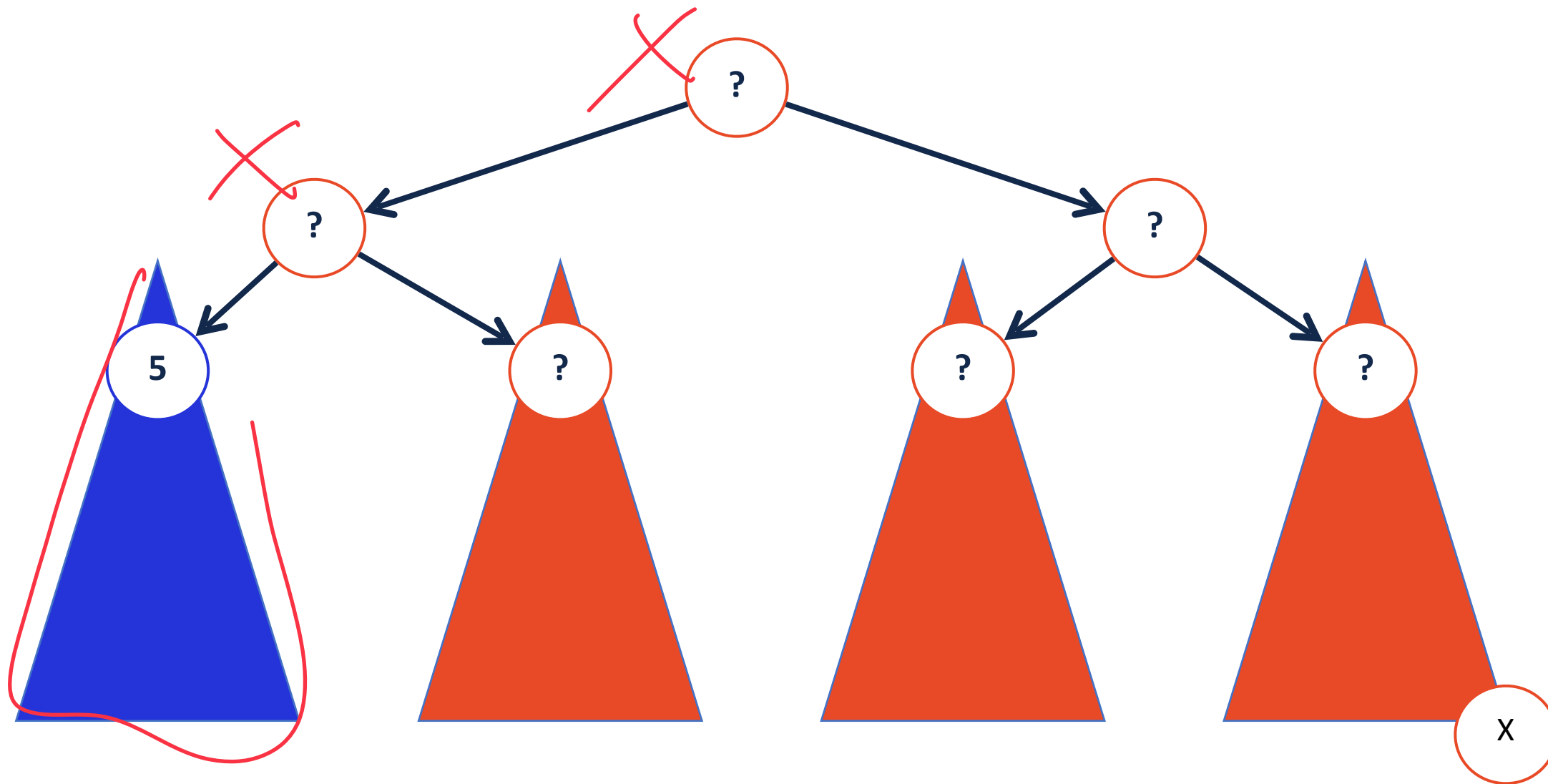
`_remove(10)` 



- Remove (pseudo code):**
- 1: Remove at proper place
  - 2: Check for imbalance
  - 3: Rotate, if necessary



# AVL Remove



# AVL Removal

Removal **may** reduce height by at most:  $1$

A rotation **always** reduces the height of the subtree by:  $1$

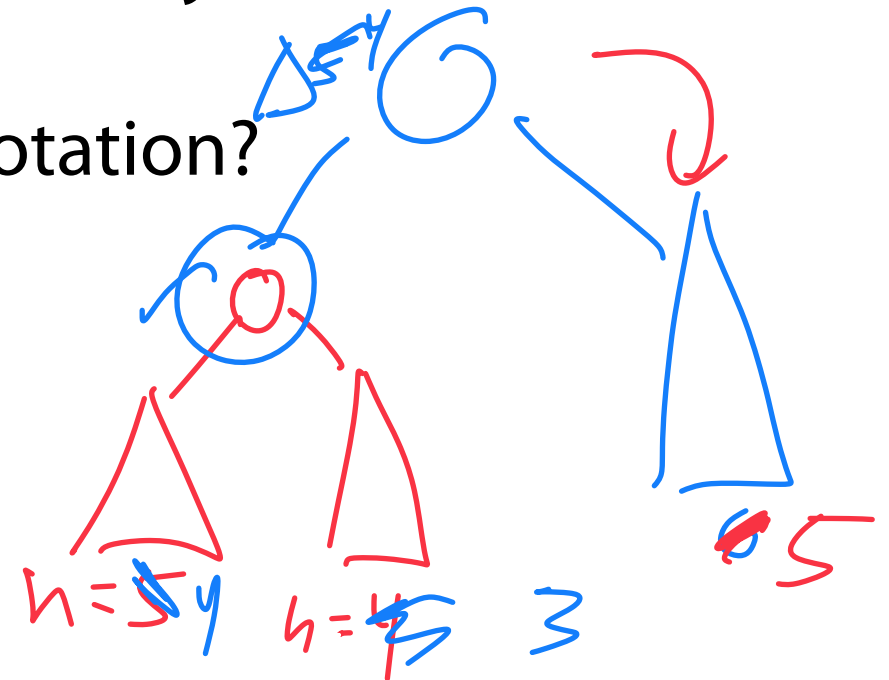
**We might have to perform a rotation at every level of the tree!**

What is the Big O of performing a single rotation?

$\hookrightarrow O(1)$

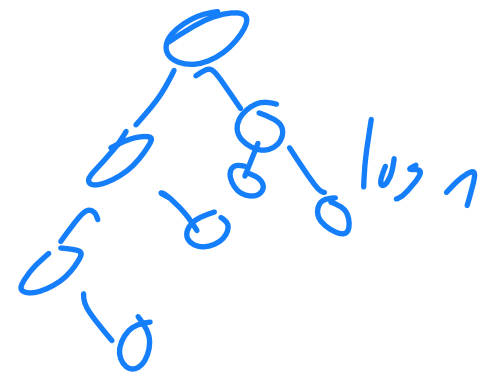
What is the Big O of removal?

$\hookrightarrow O(\log n)$



# AVL Tree Analysis

$$h = O(\log n)$$



For AVL tree of height  $h$ , we know:

find runs in:  $O(\log n)$ .

insert runs in:  $O(\log n)$ .

1 rotation + 1 insert

remove runs in:  $O(\log n)$ .

$h$  rotations + 1 remove  
 $O(\log n)$   $O(\log n)$

**Claim:** For a balanced binary search tree  $h = \log(n)$ .

# Whats next?

Trees  $\rightarrow$  Graph

A non-linear data structure defined recursively as a collection of nodes where each node contains a value and zero or more connected nodes.

graph

(In CS 277) a tree is also:

Cycles

~~1) Acyclic — contains no cycles~~

~~2) Rooted — root node connected to all nodes~~

