

Balanced BSTs

Abstract Data Type	Operations	Data Structures
Dictionary		

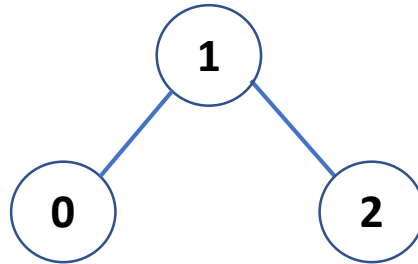
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Recall the problem with BSTs...

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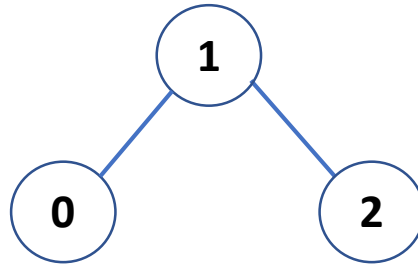
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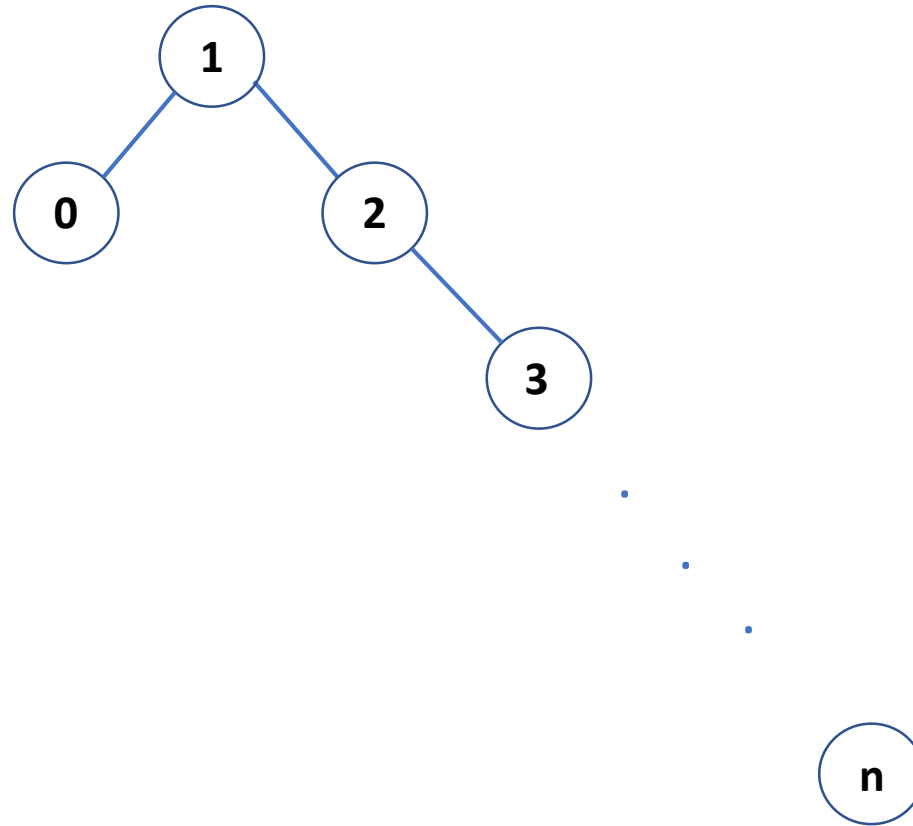
Insert keys 3, 4, 5, ..., n



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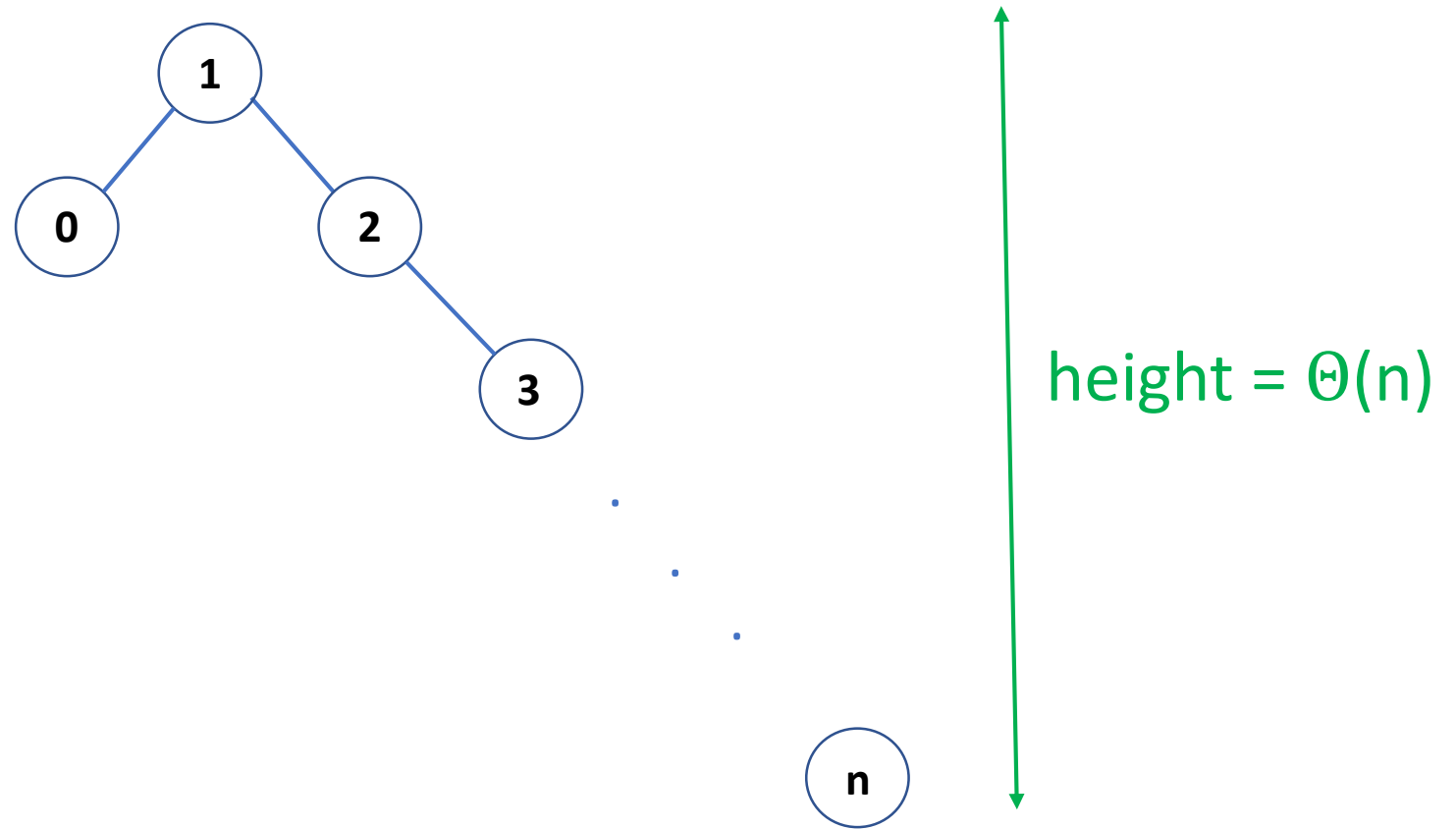
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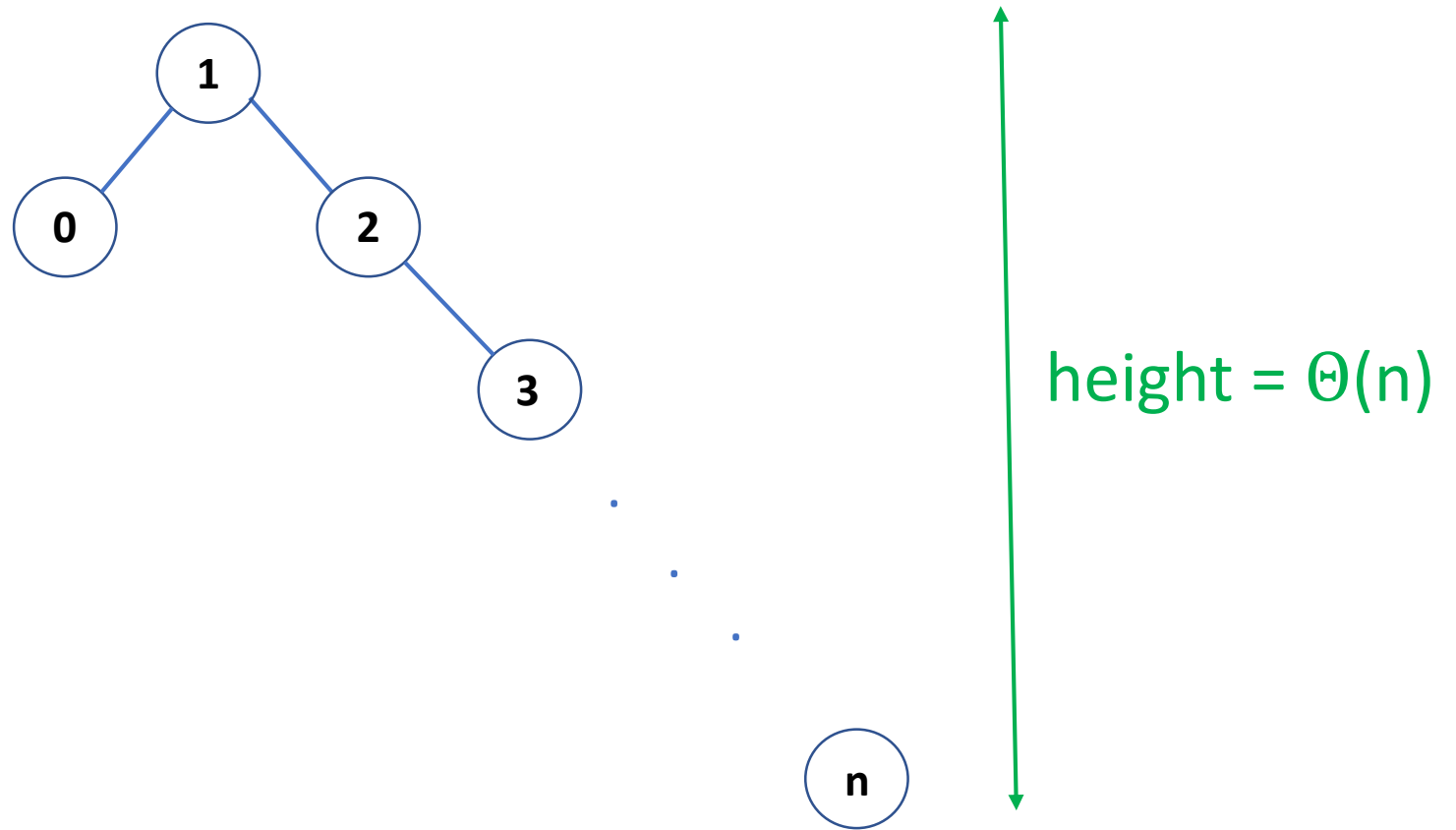


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Search takes $\Theta(n)$!



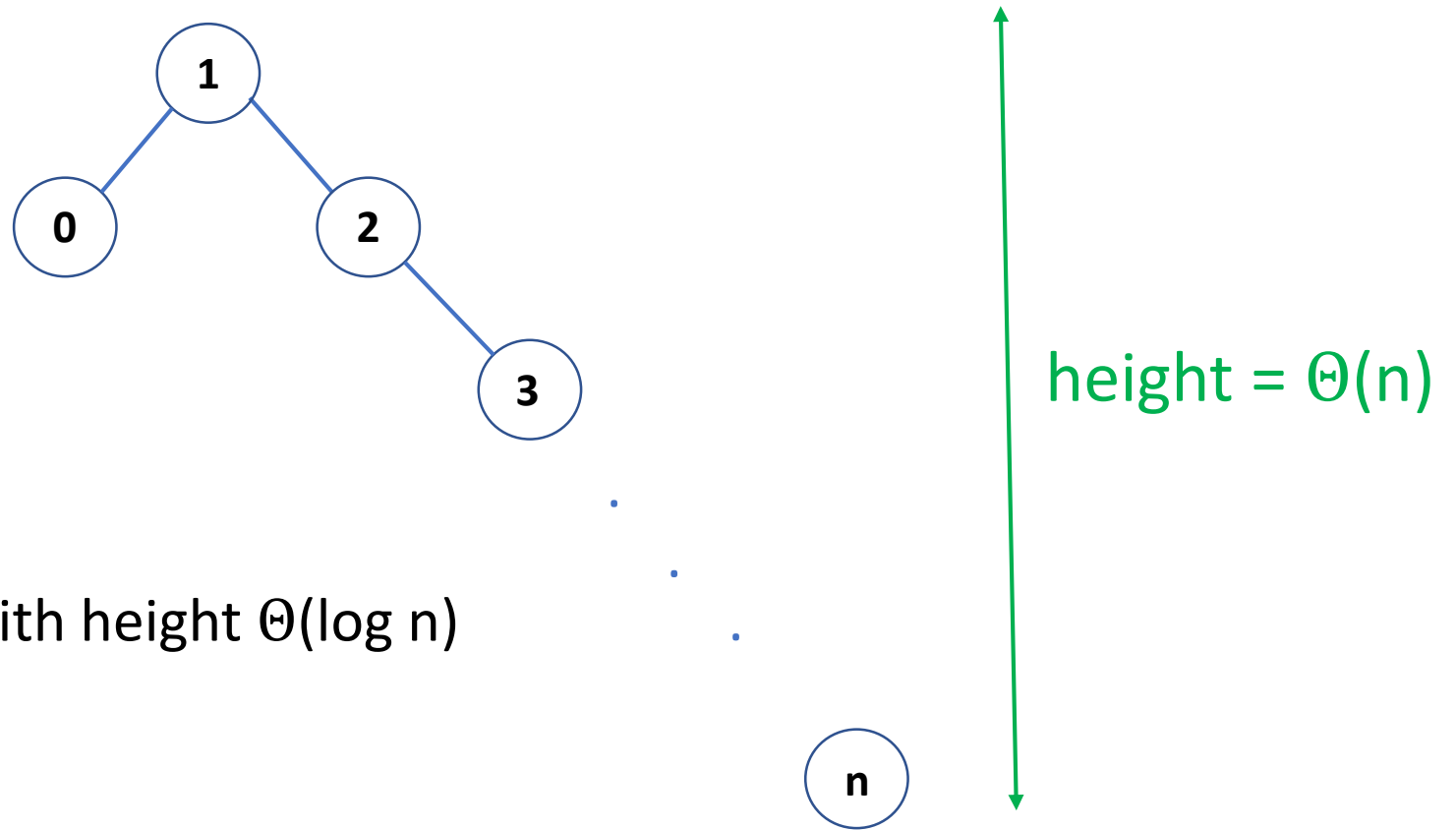
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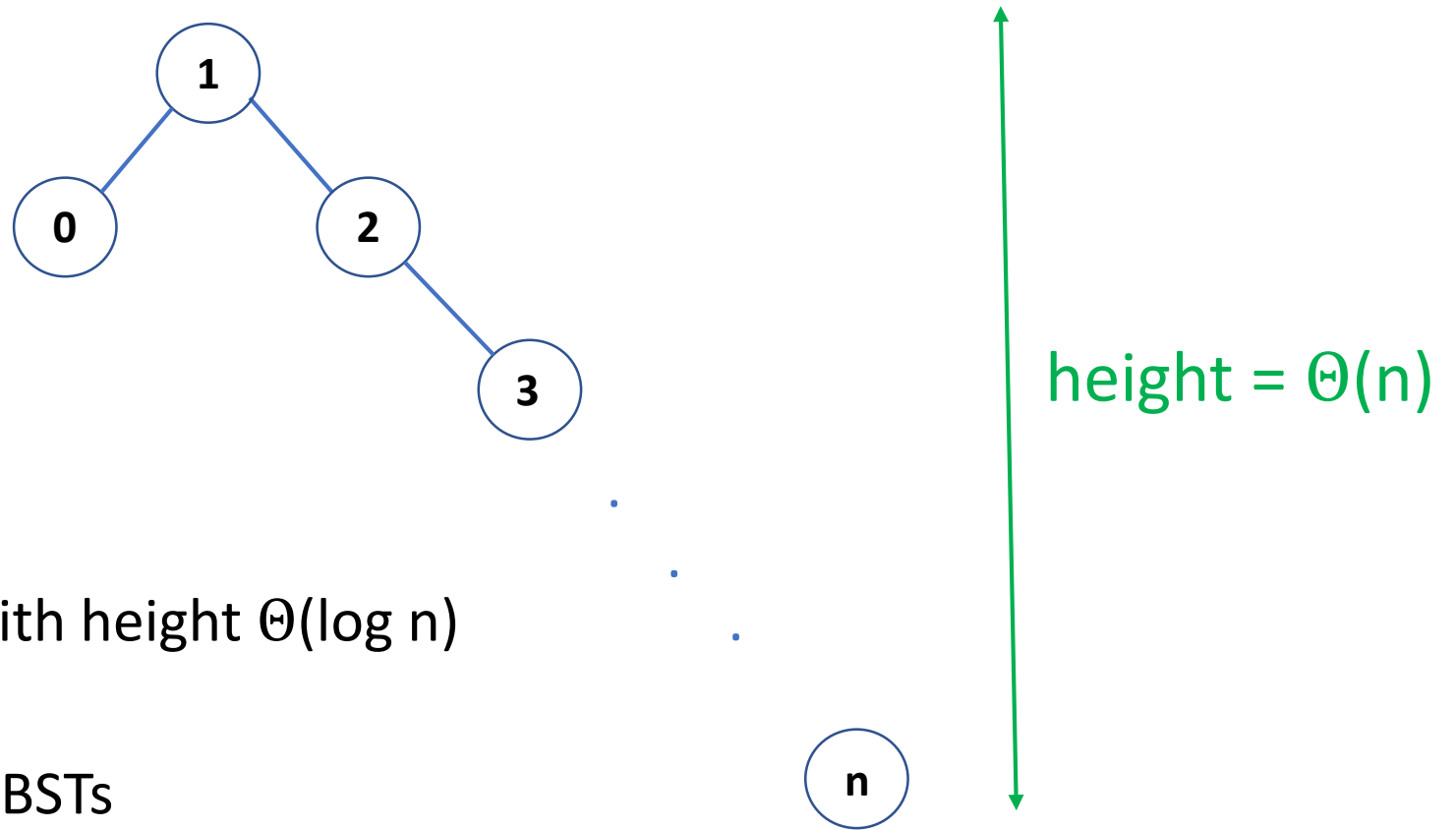
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We achieve this using **balanced** BSTs



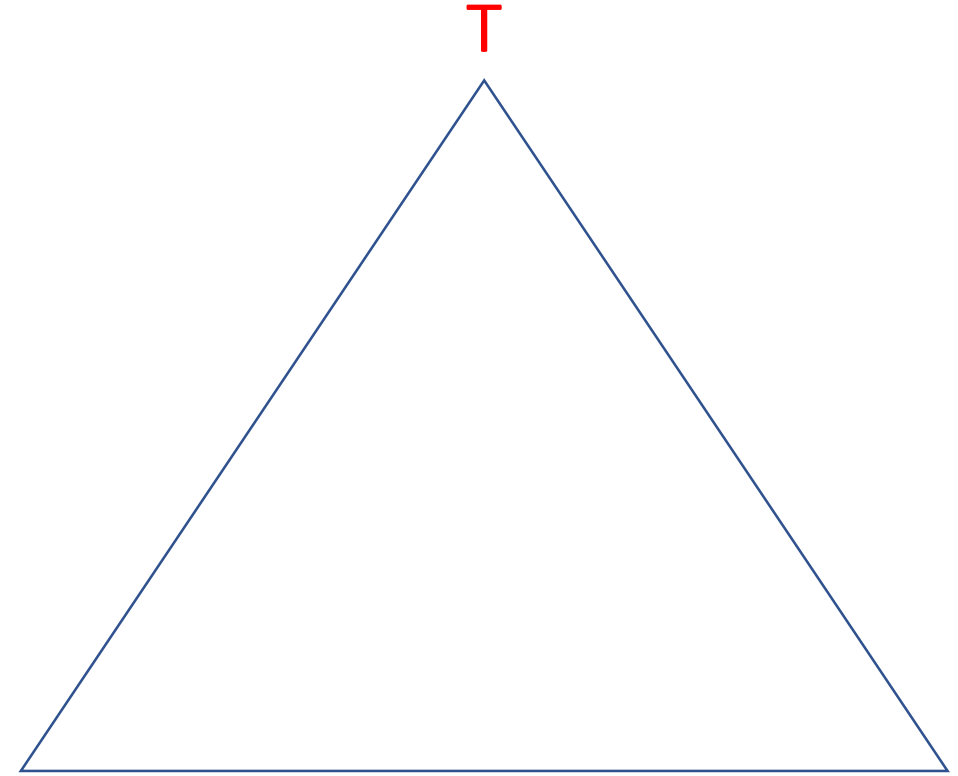
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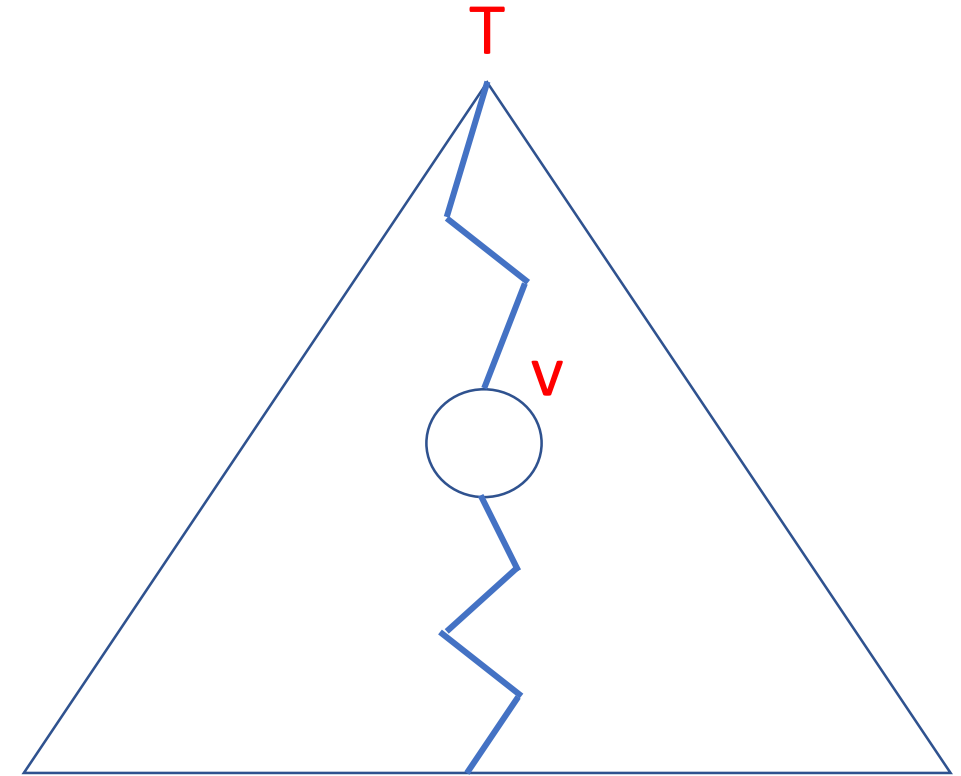
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AVL Trees

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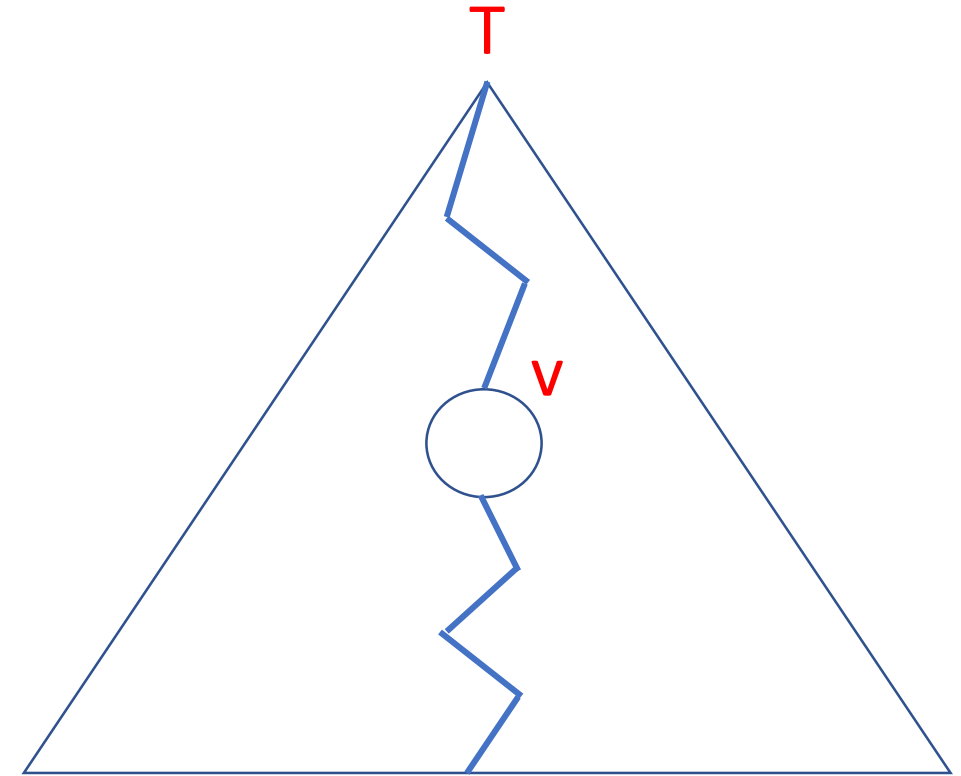


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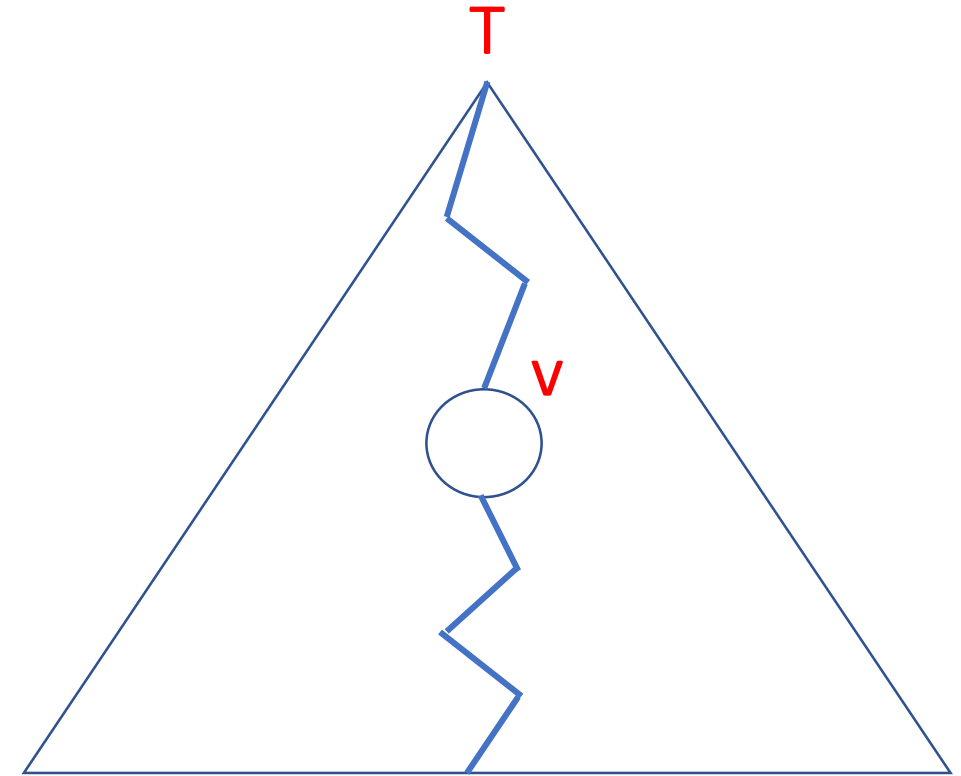
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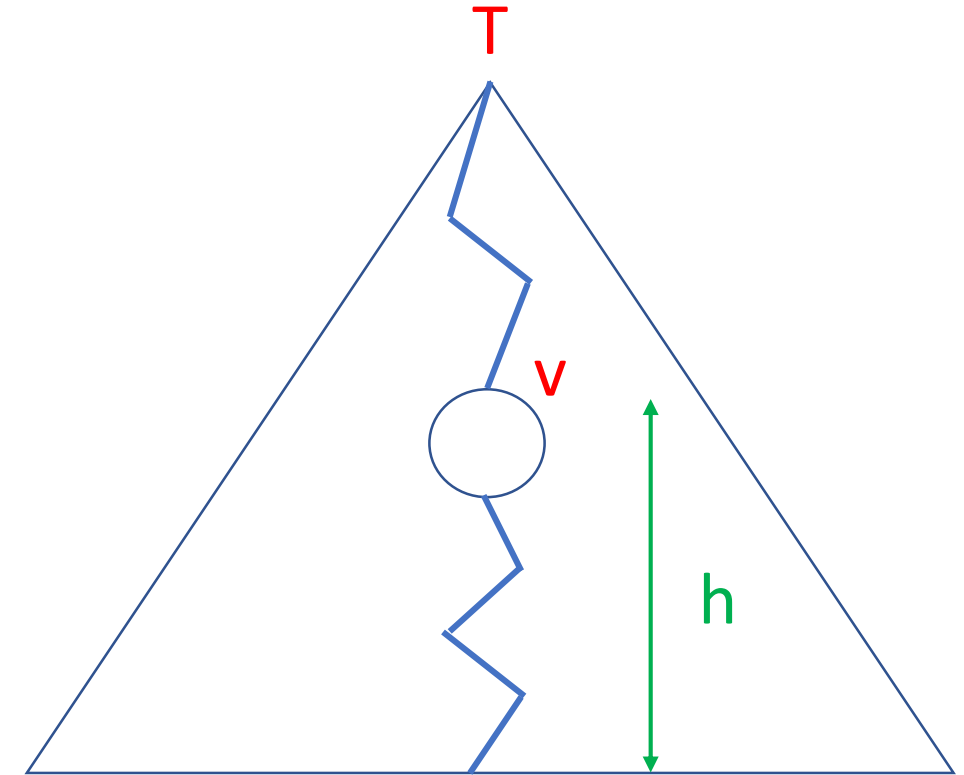
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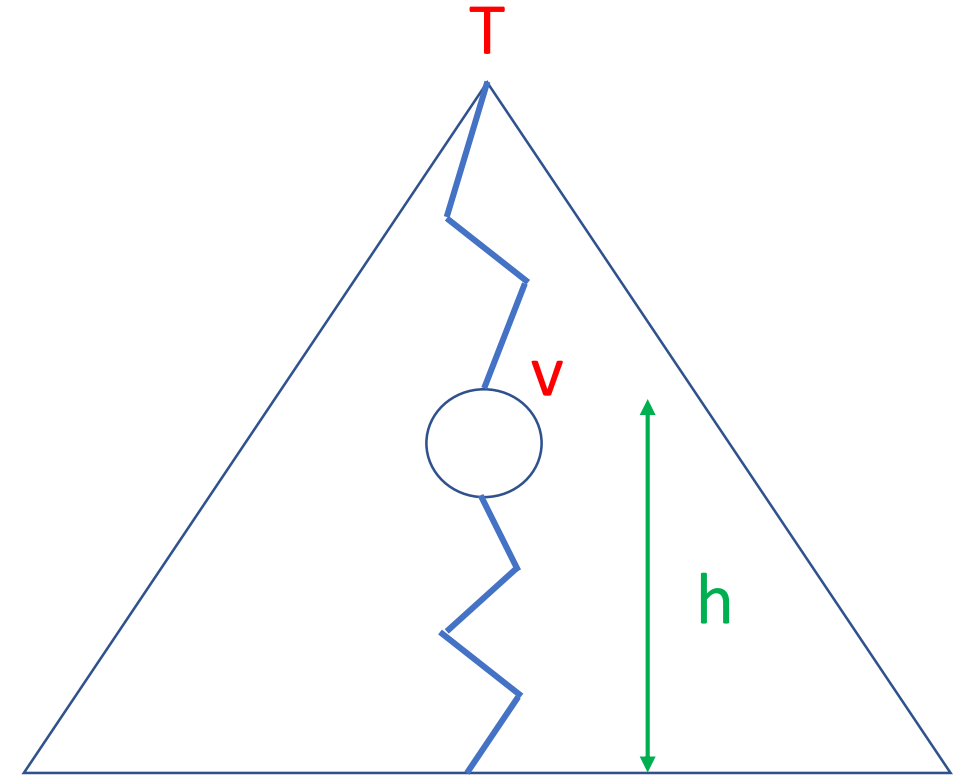
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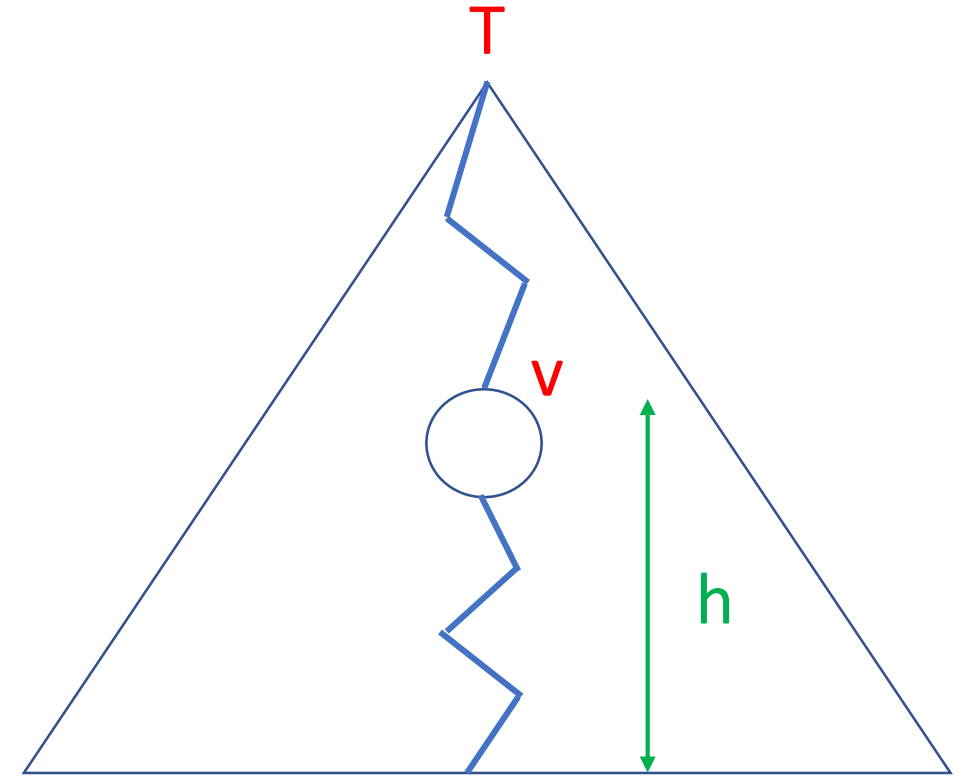
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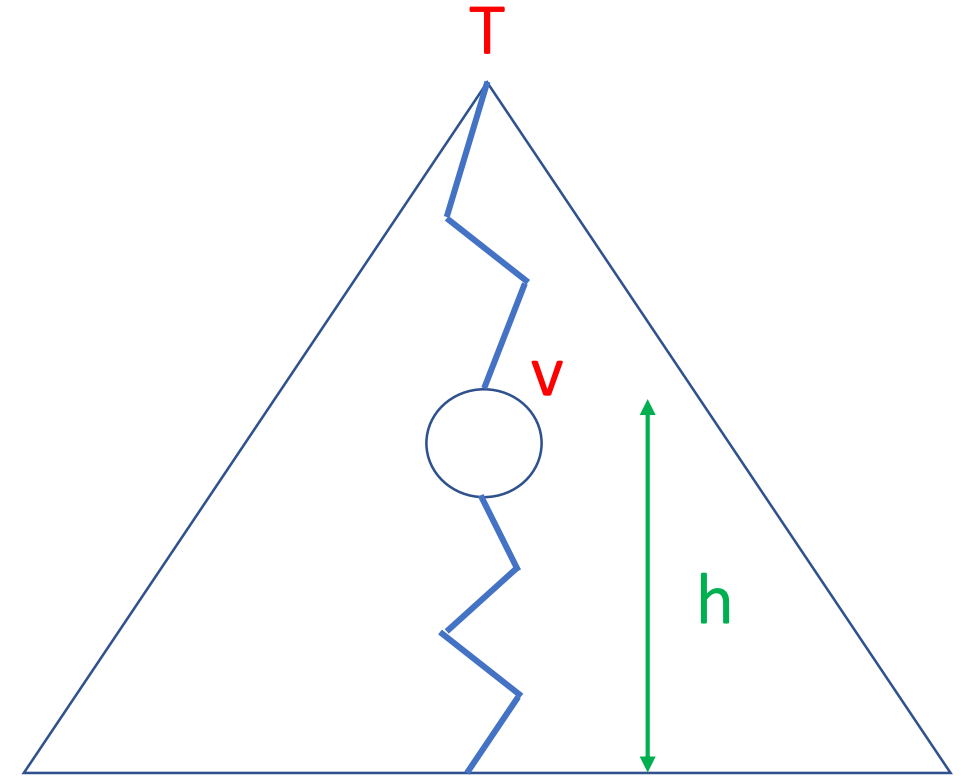


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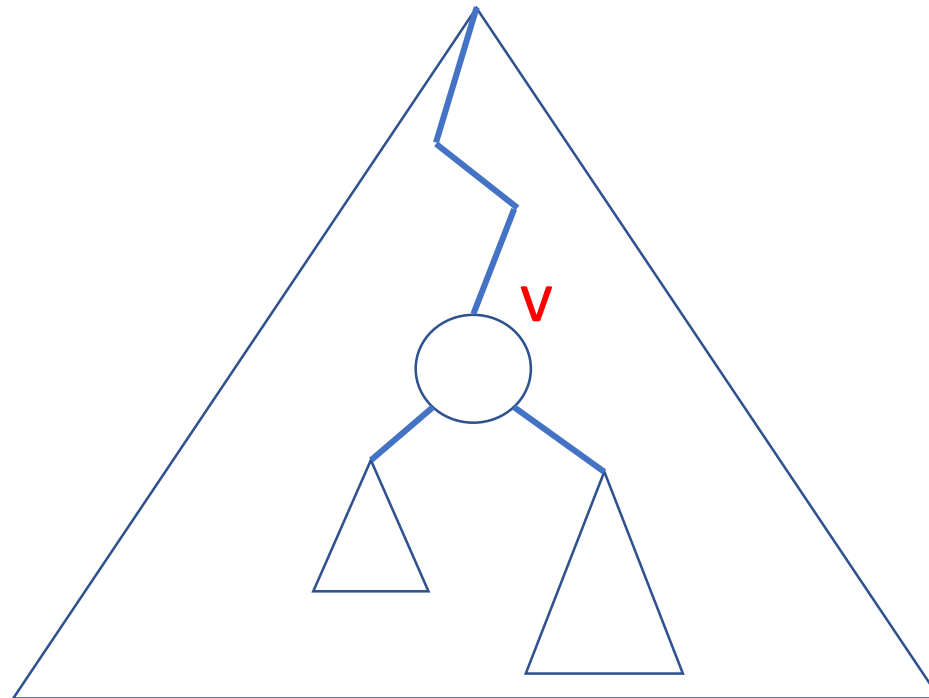
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$\text{height}(\text{empty tree}) = -1$

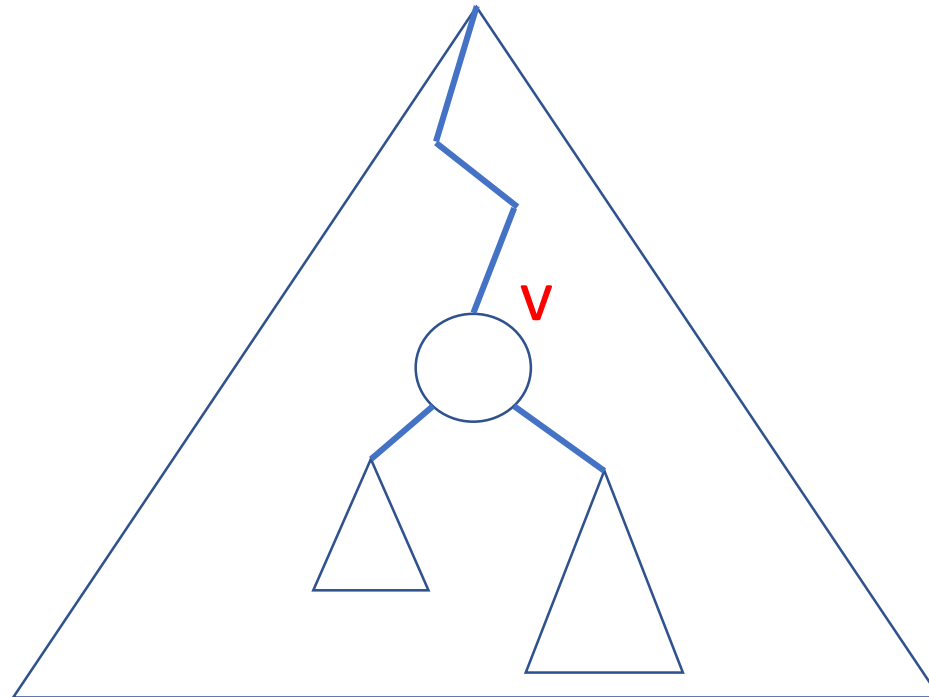


Balance Factor (BF) of a node v



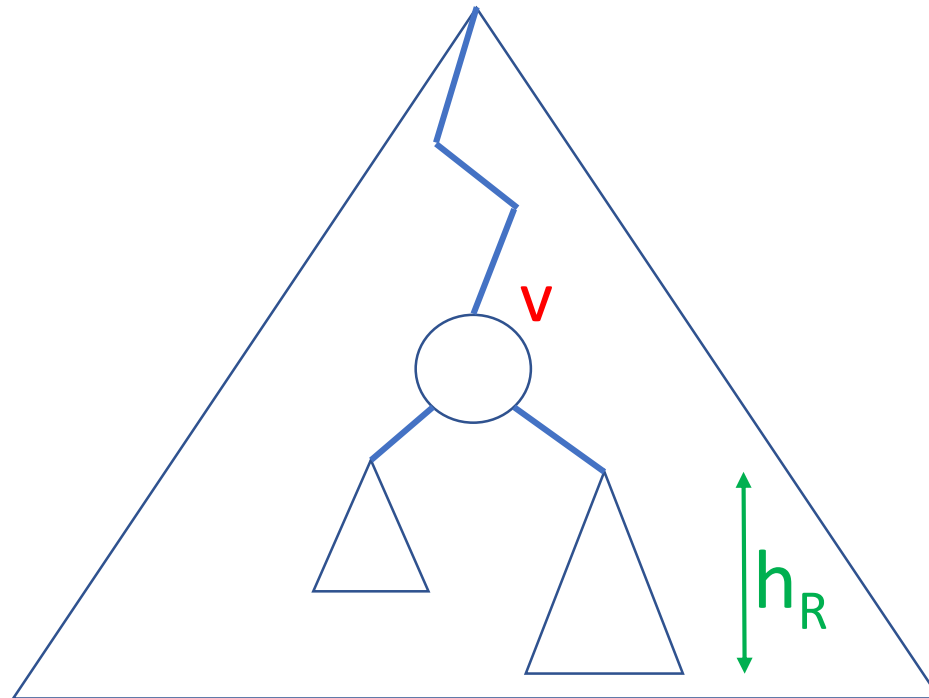
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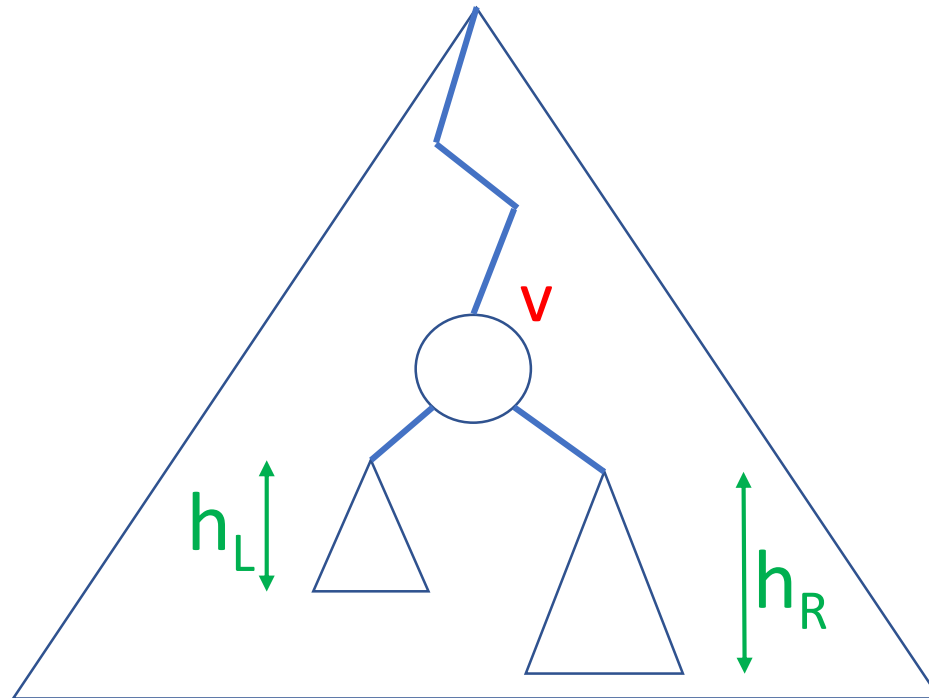
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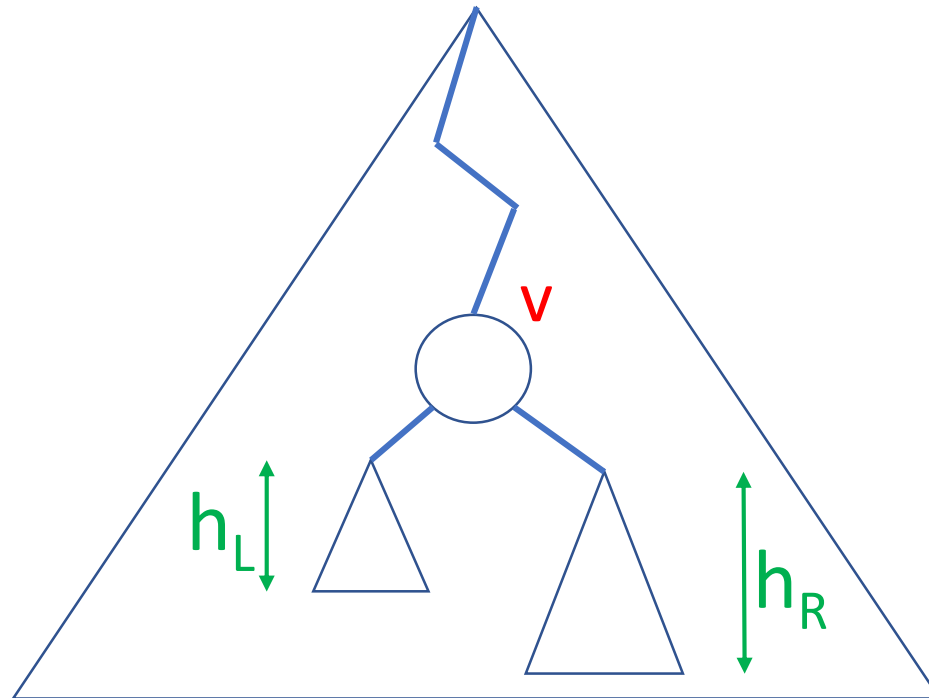
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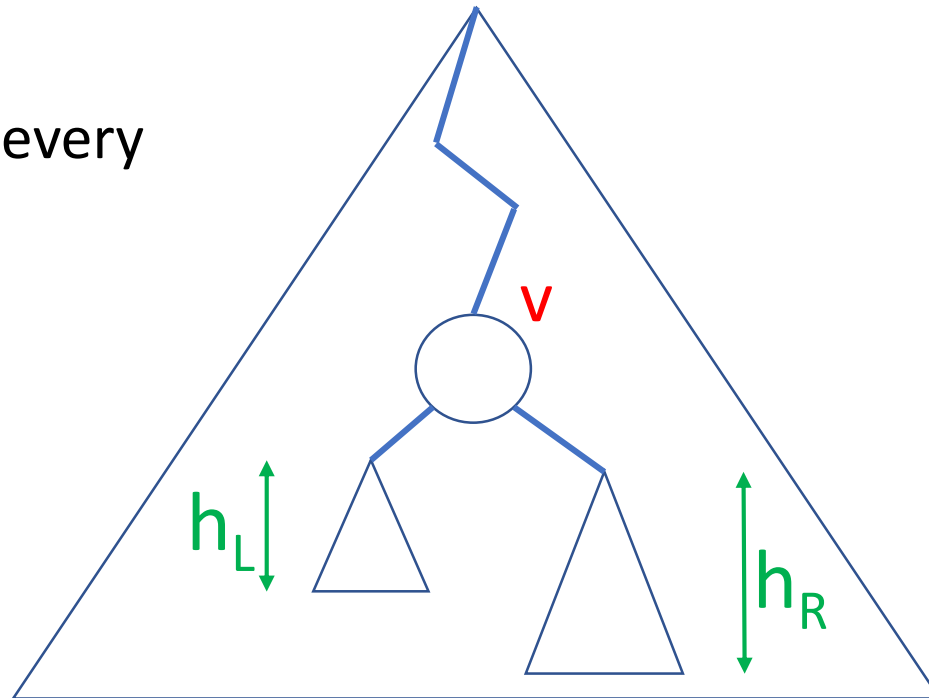


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We would like the BF of every node to be close to 0



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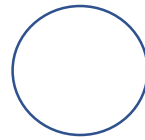
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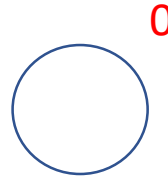
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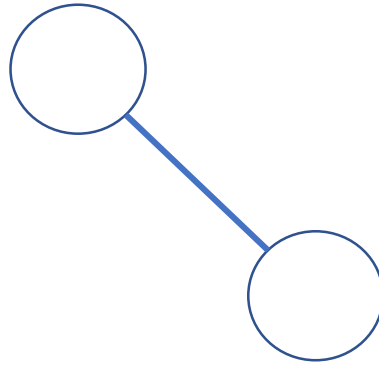
Is this an AVL tree?



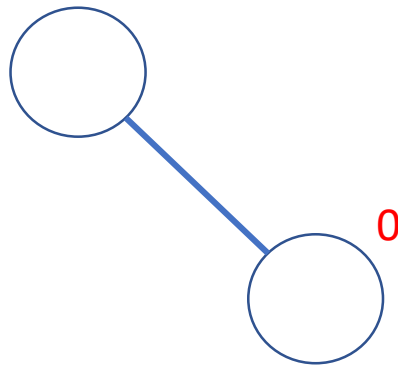
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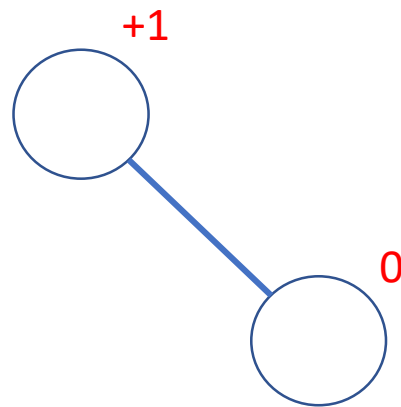
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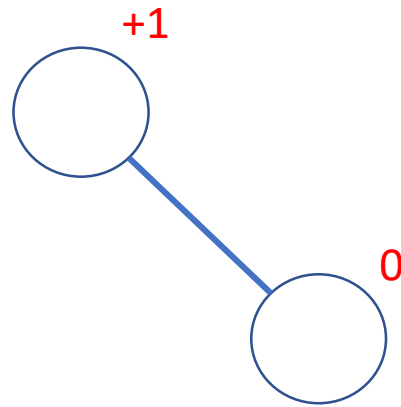
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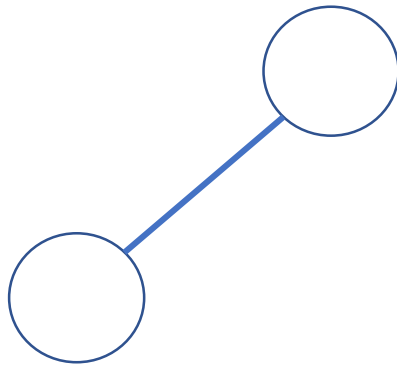
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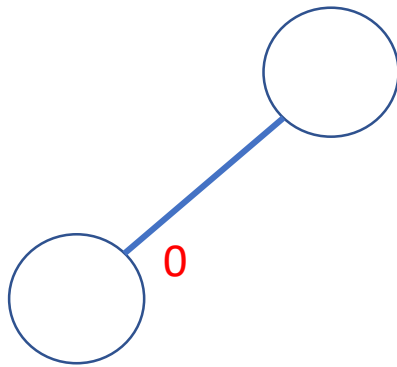
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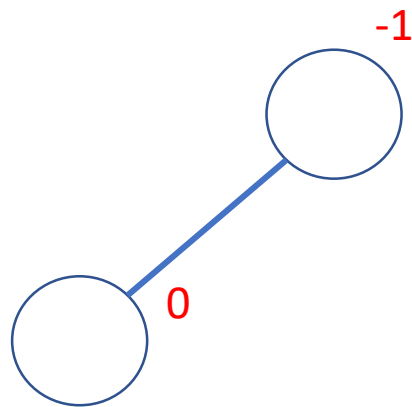
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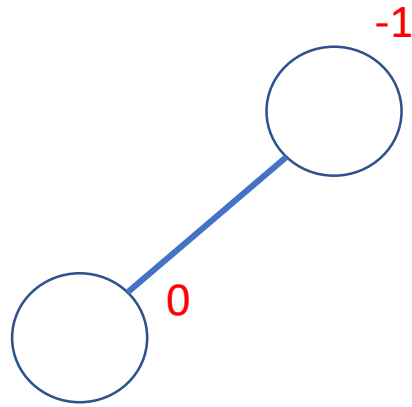
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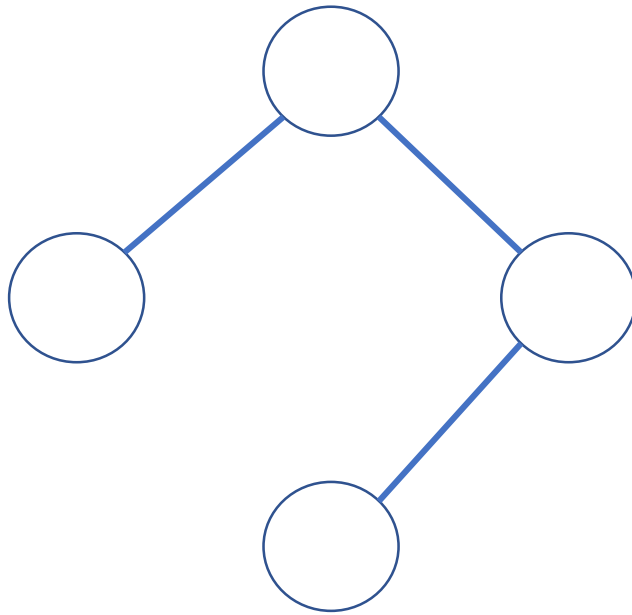
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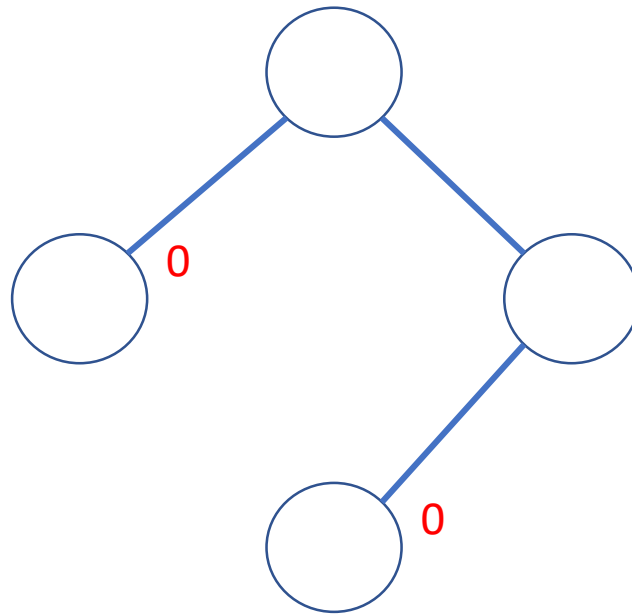
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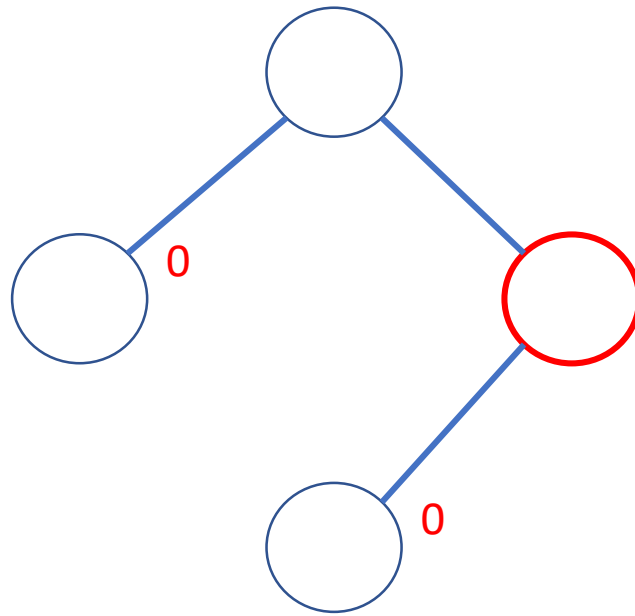
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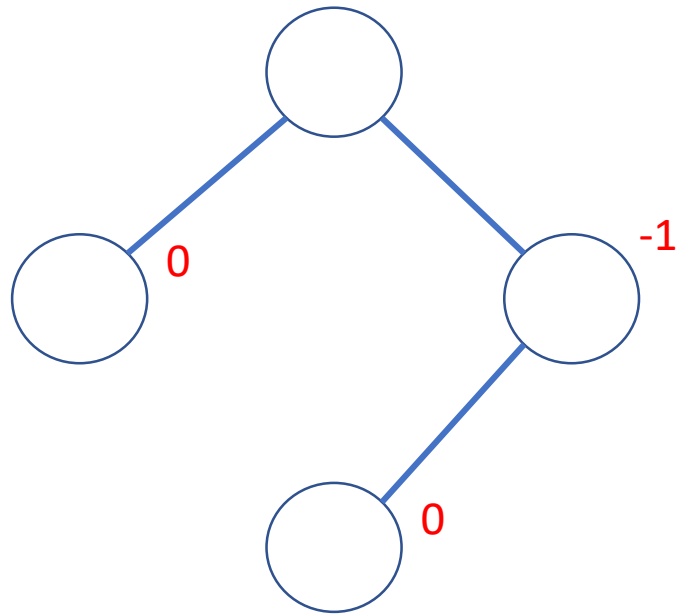
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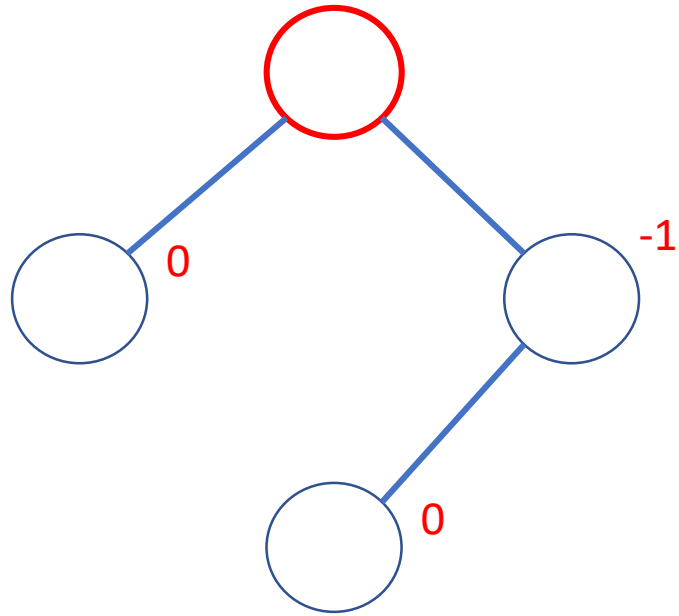
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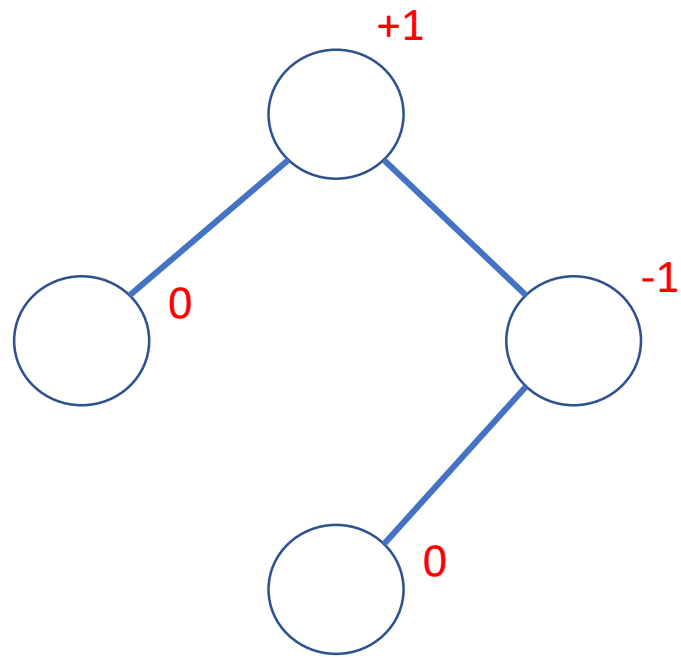
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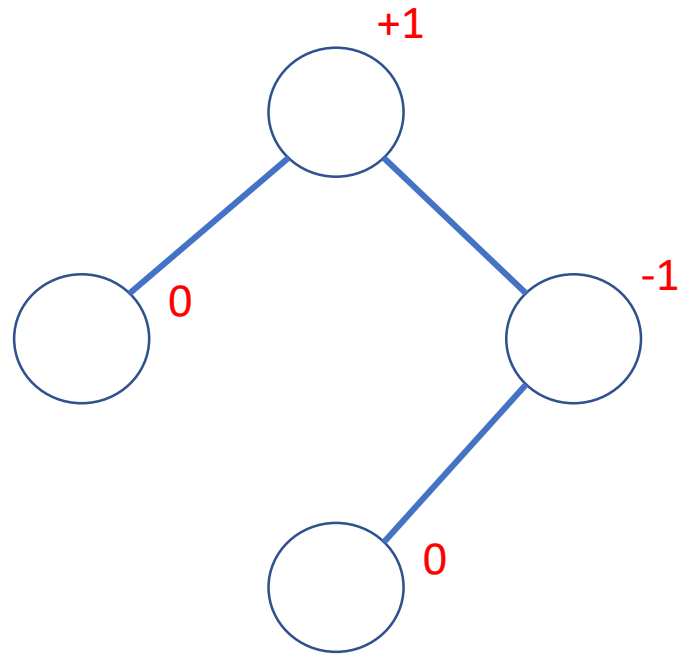
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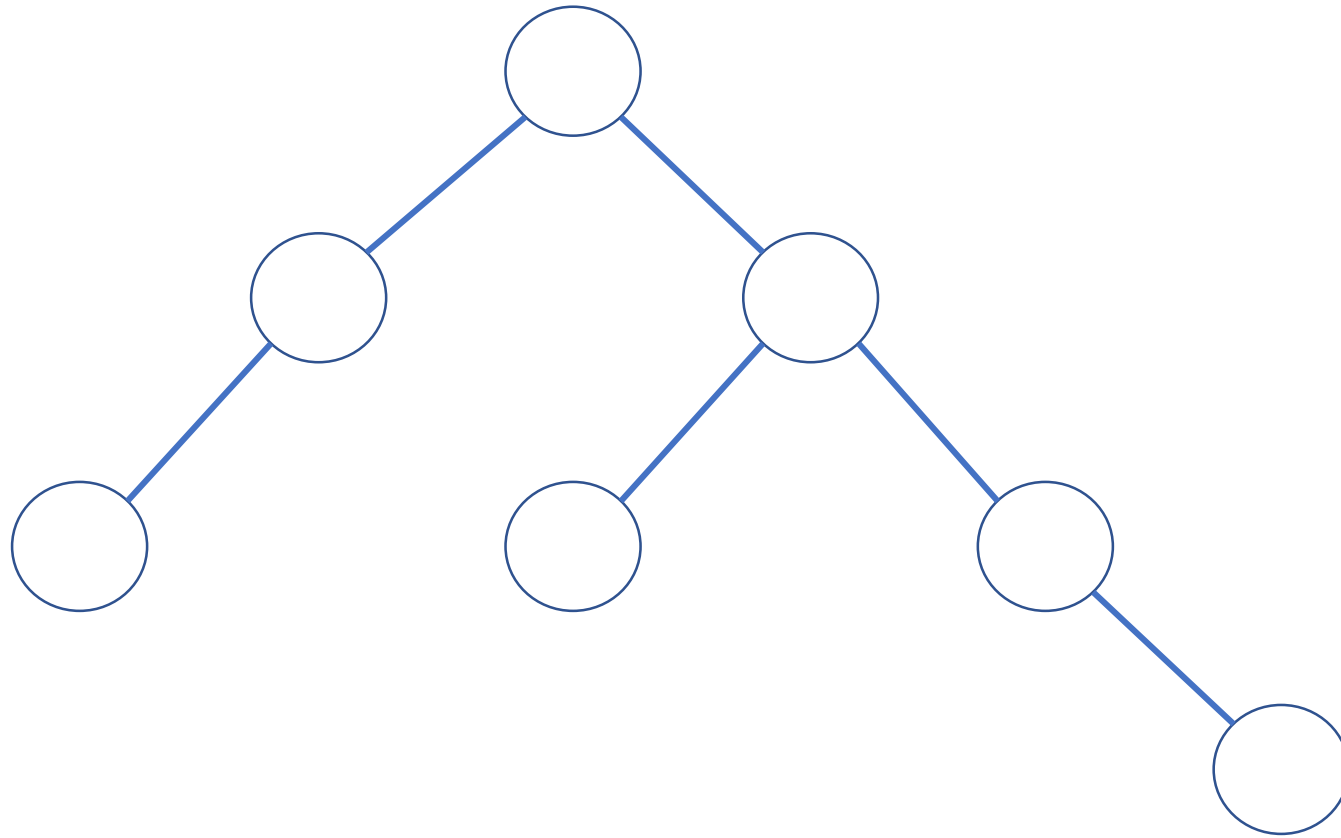
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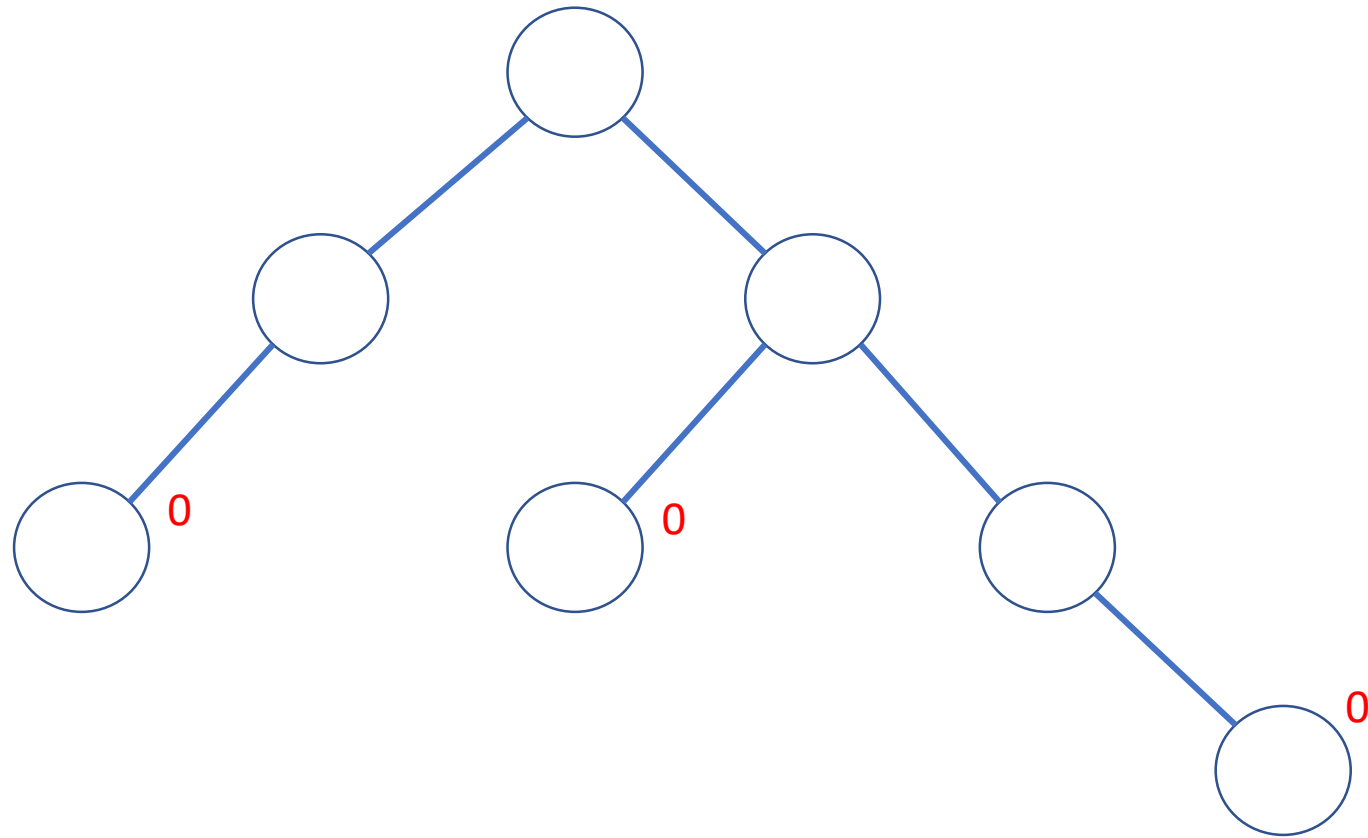
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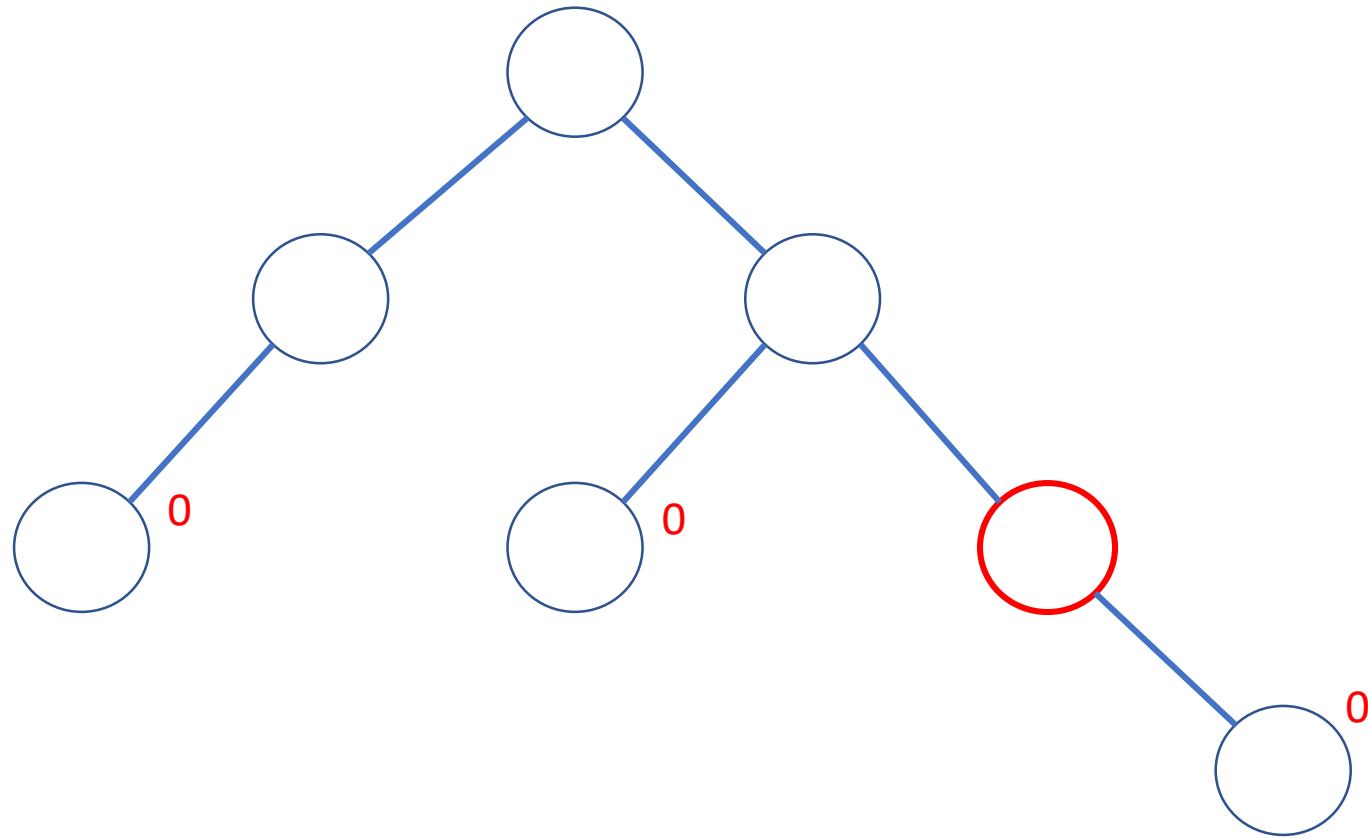
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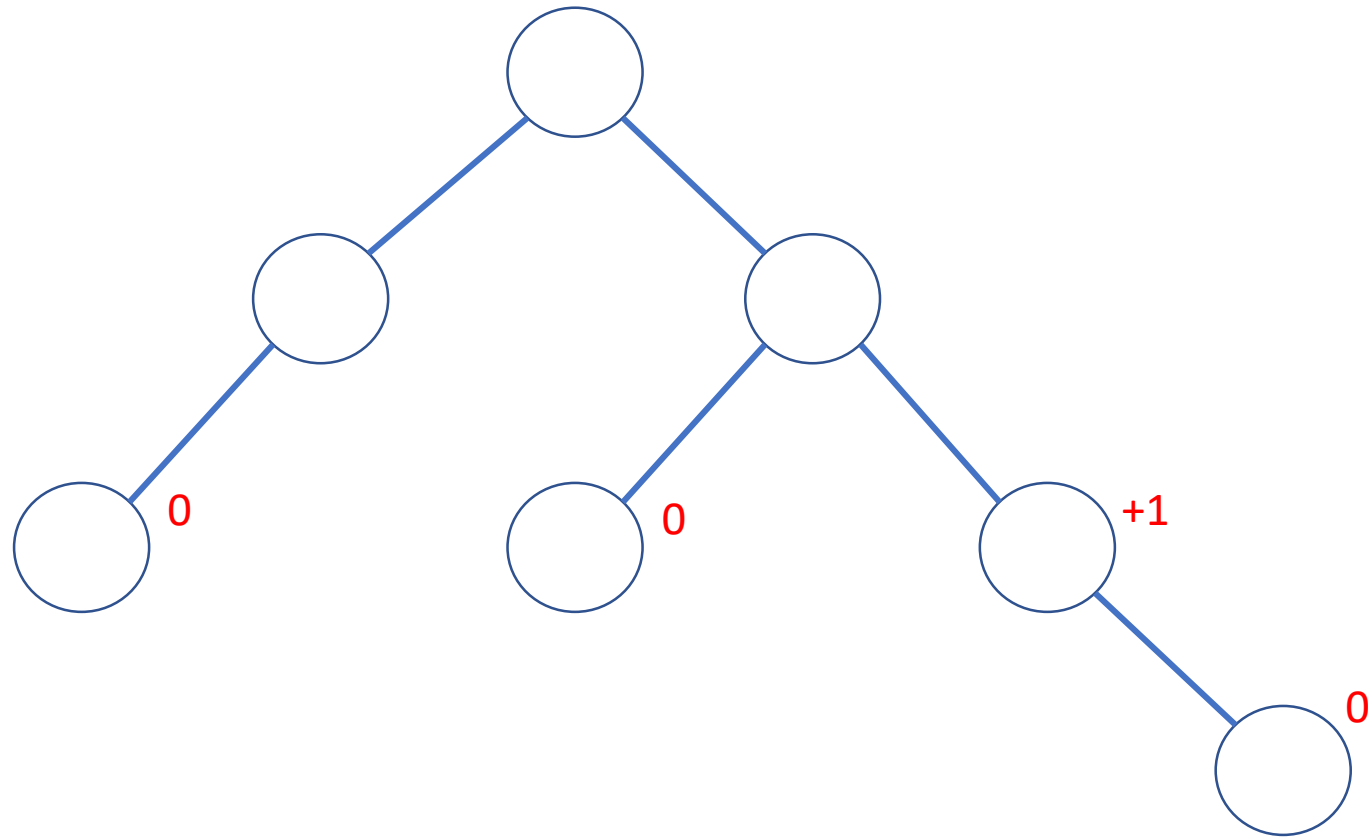
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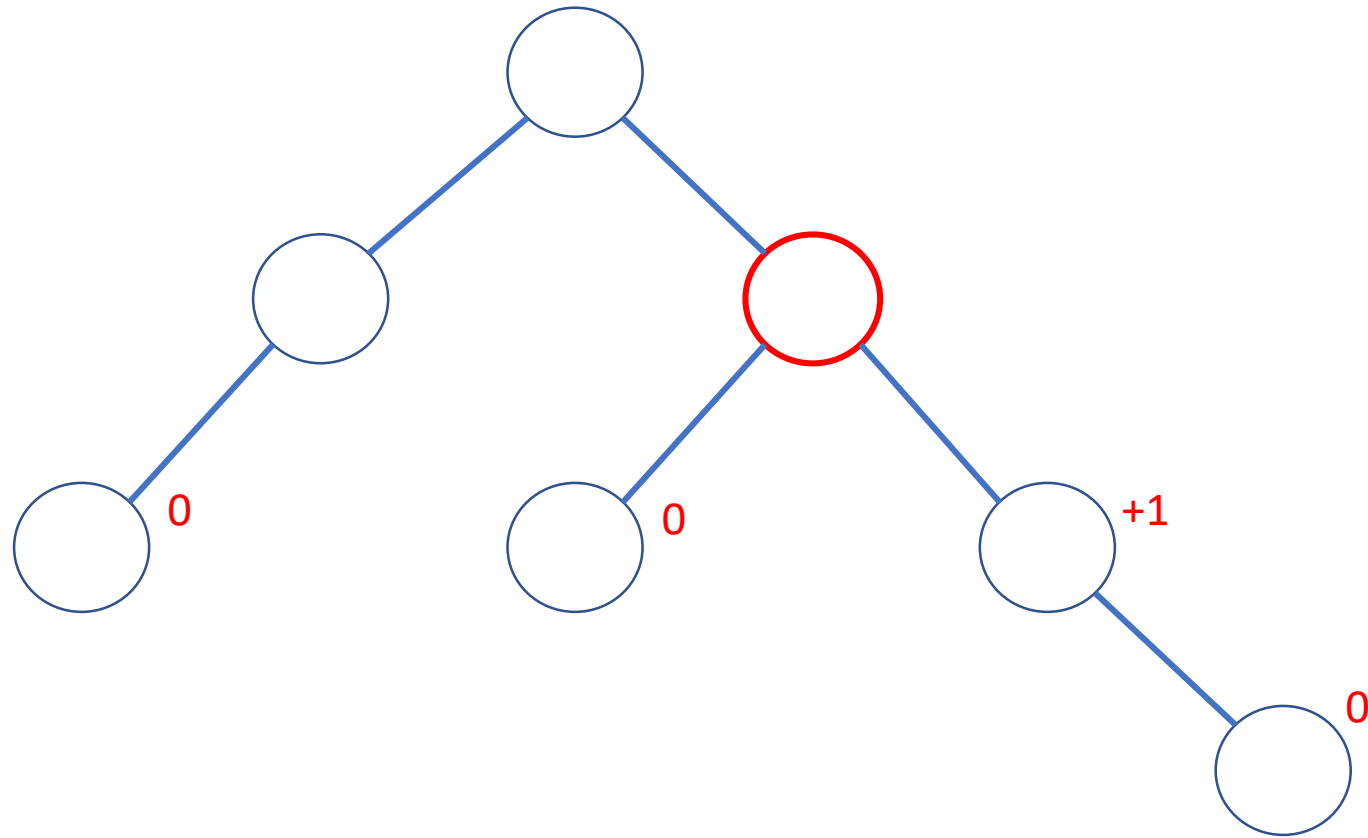
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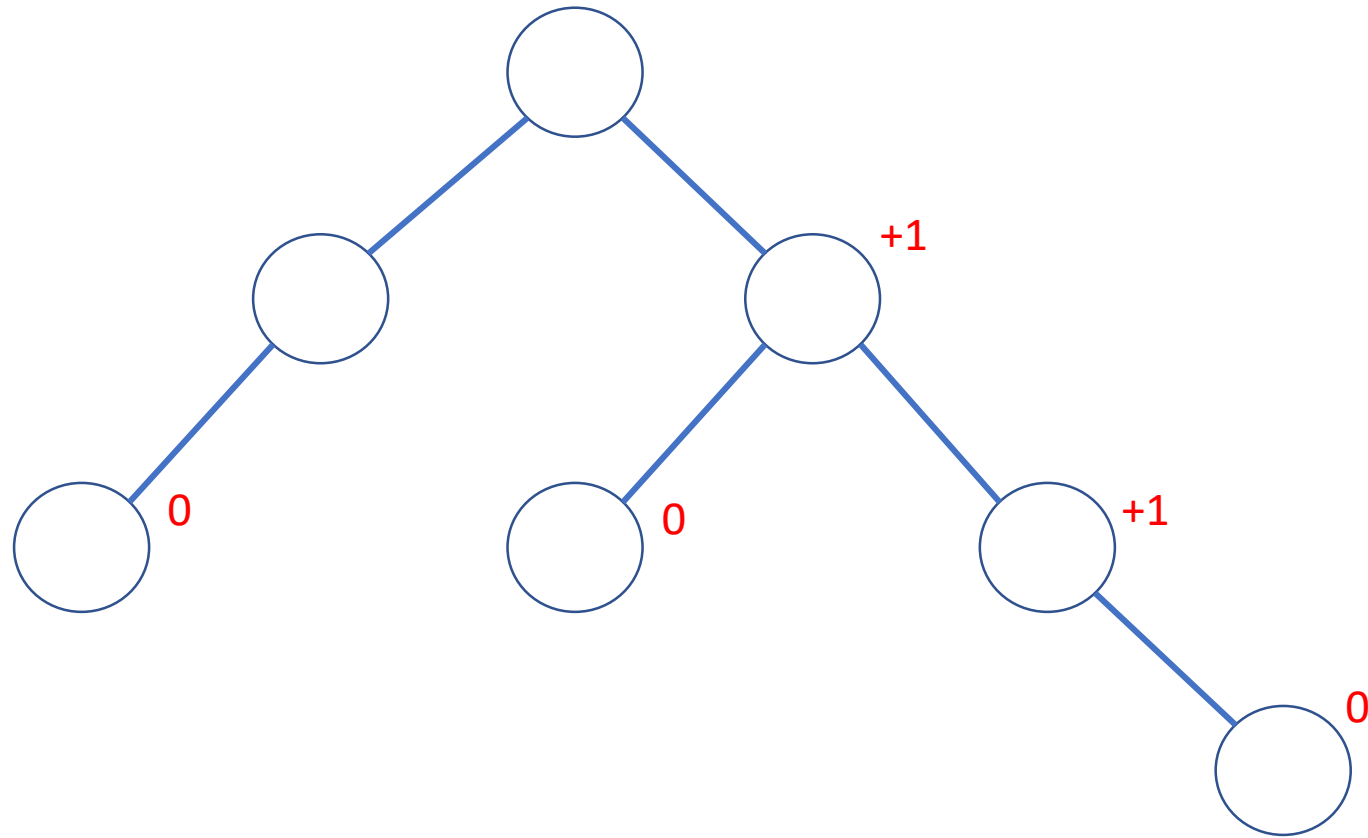
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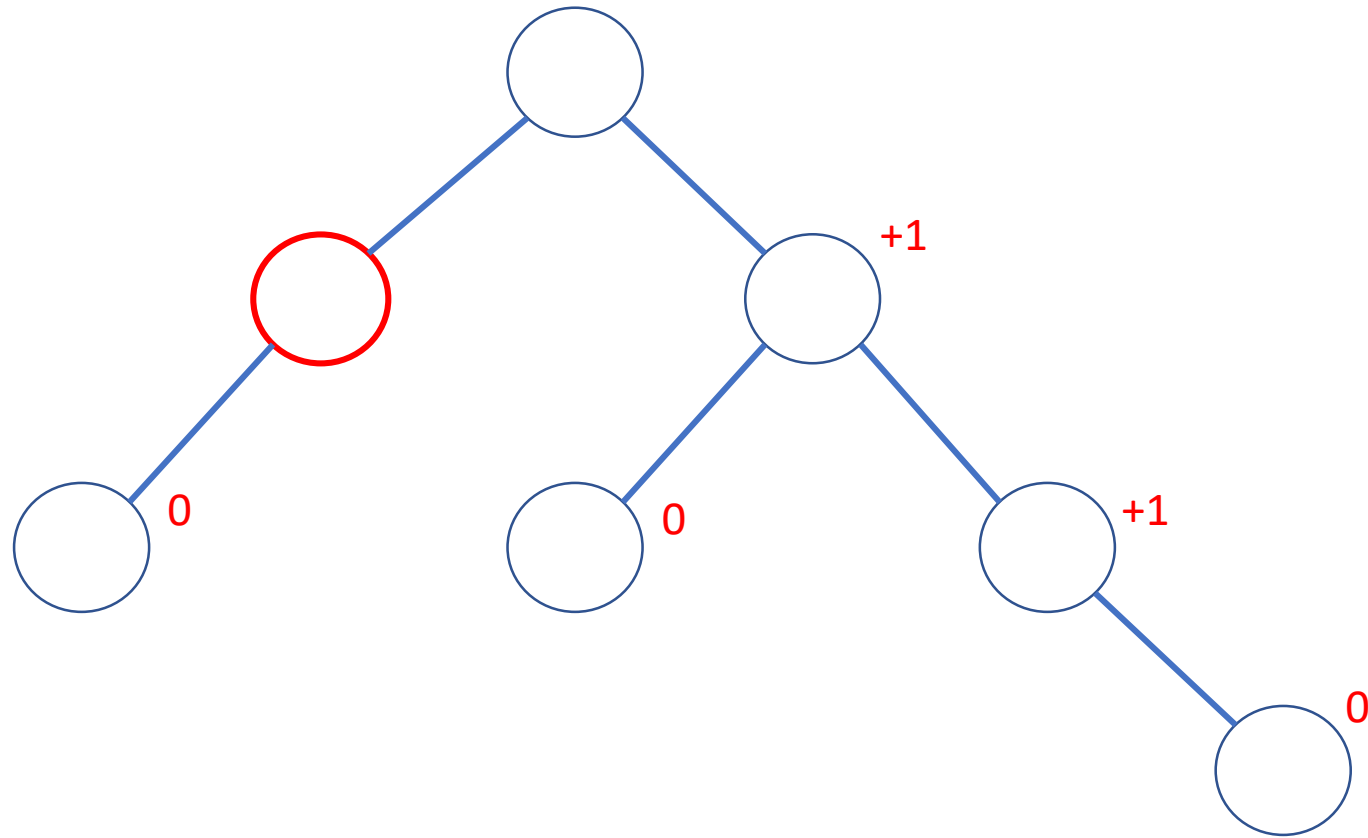
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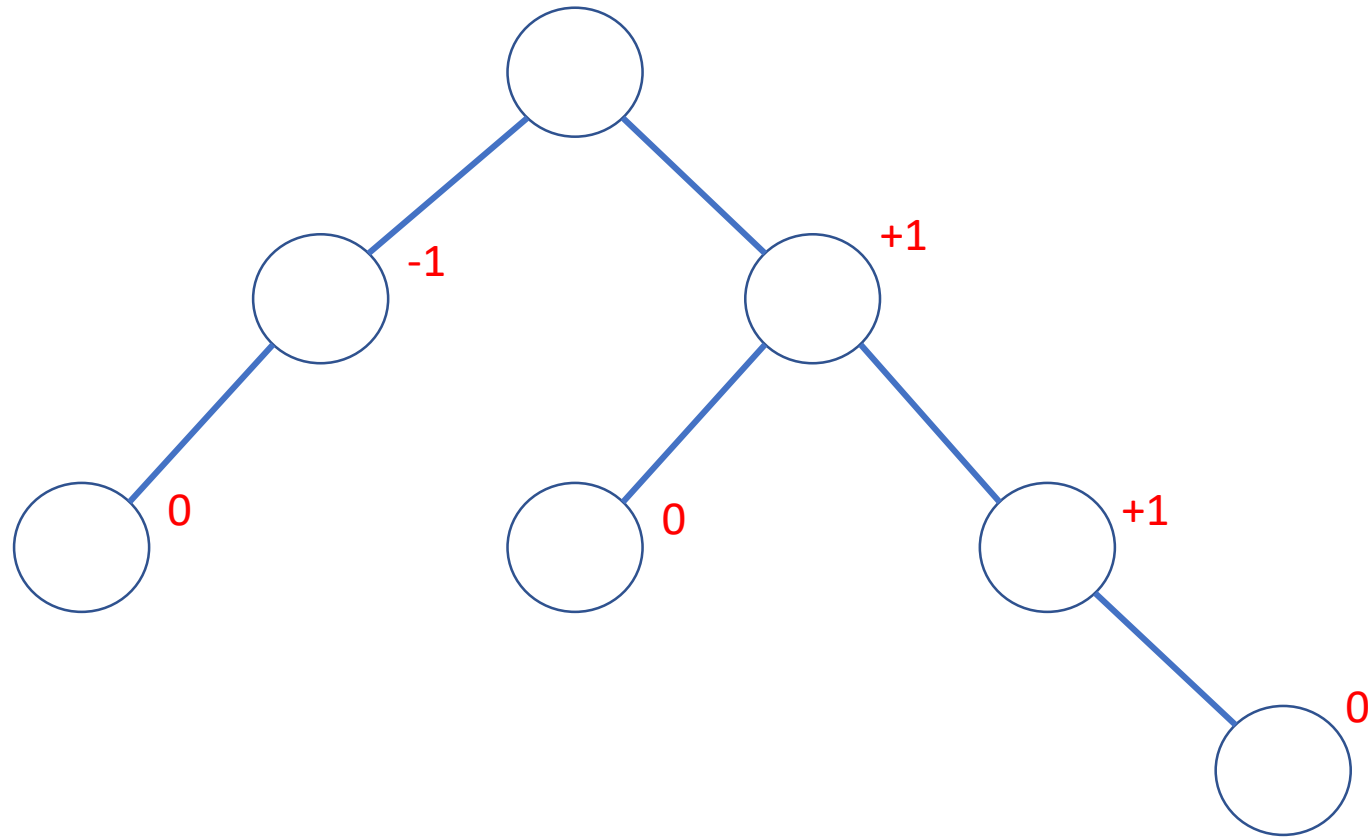
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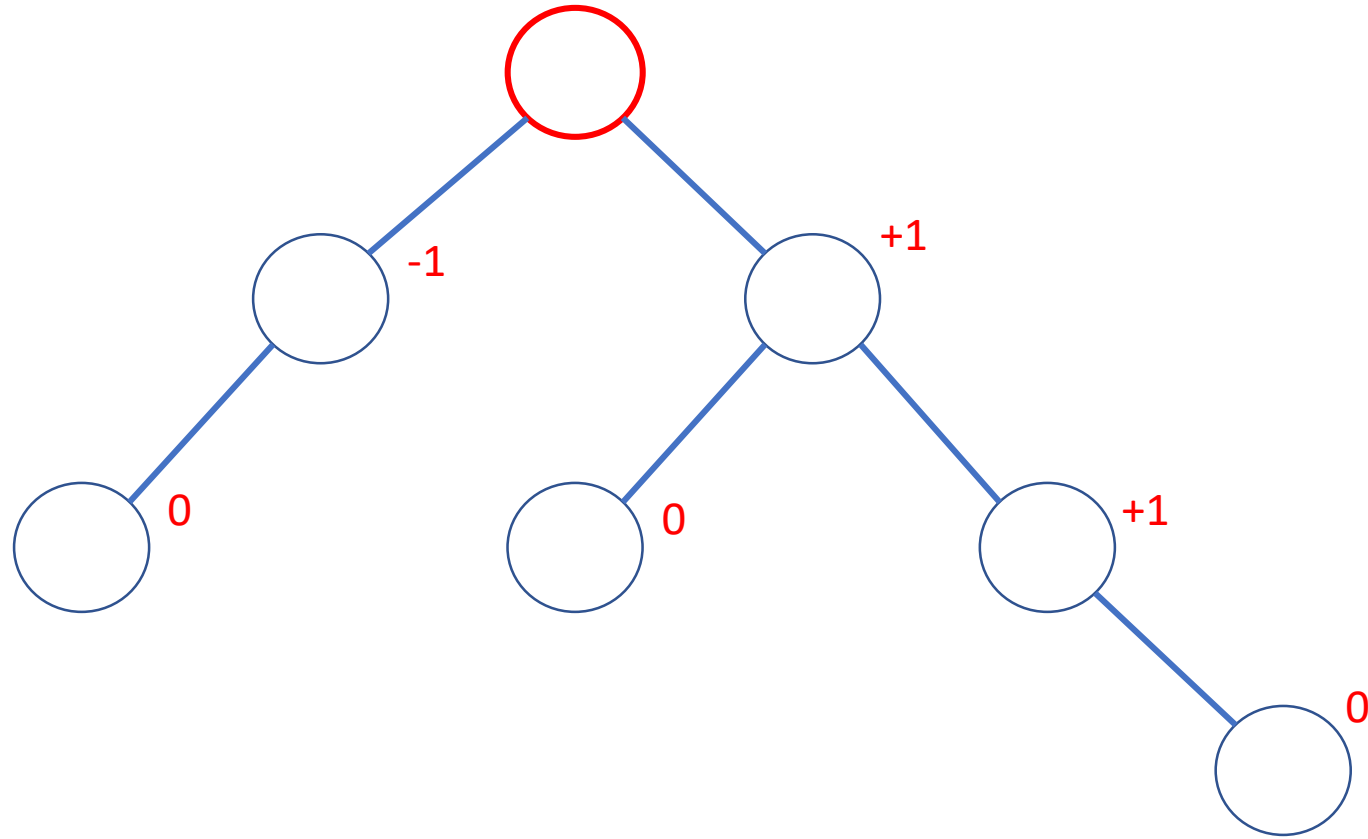
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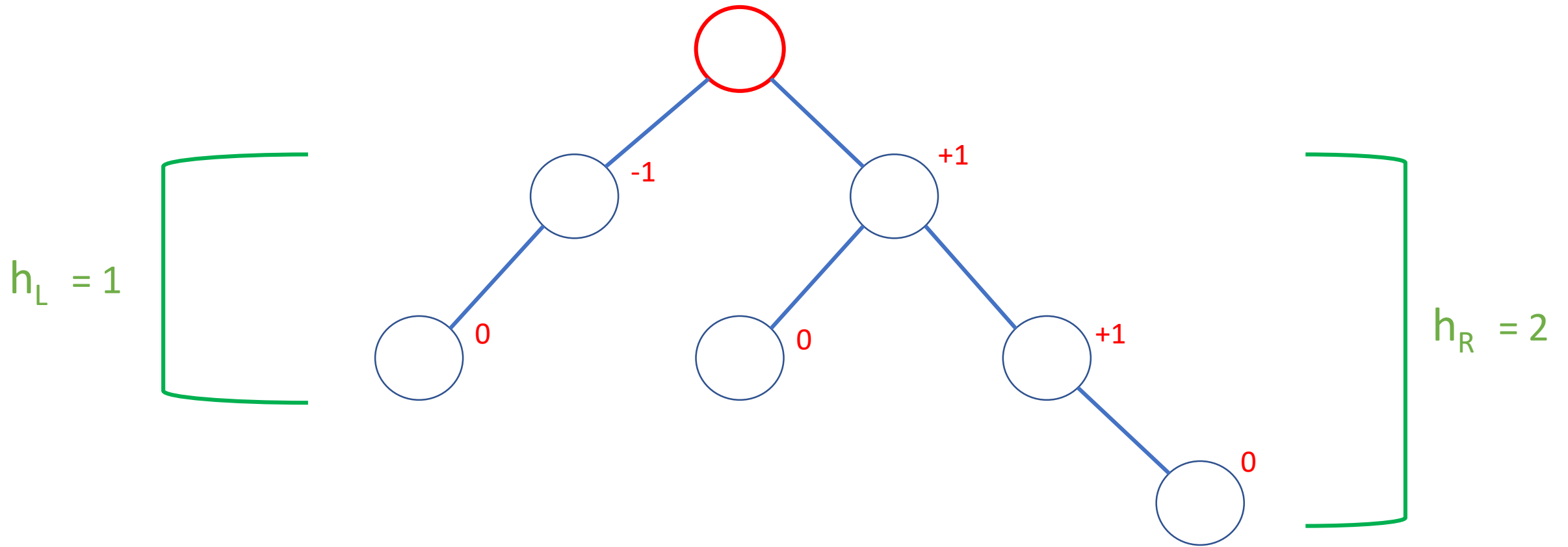
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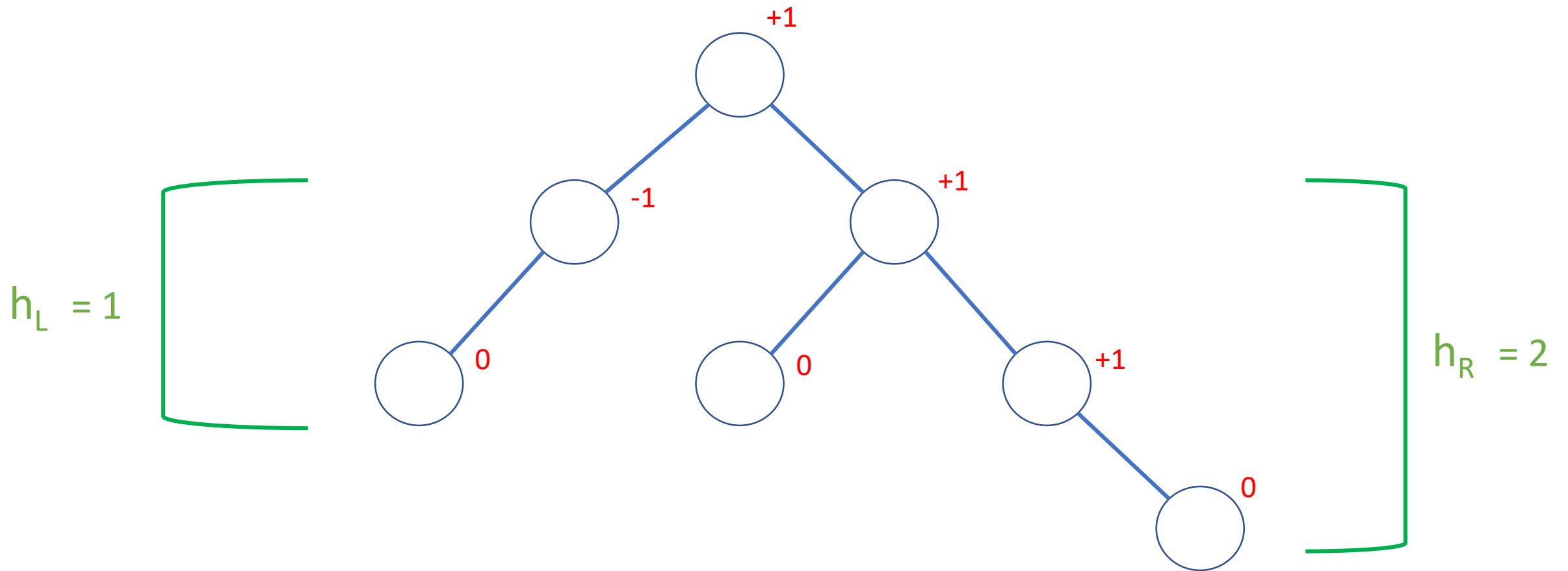
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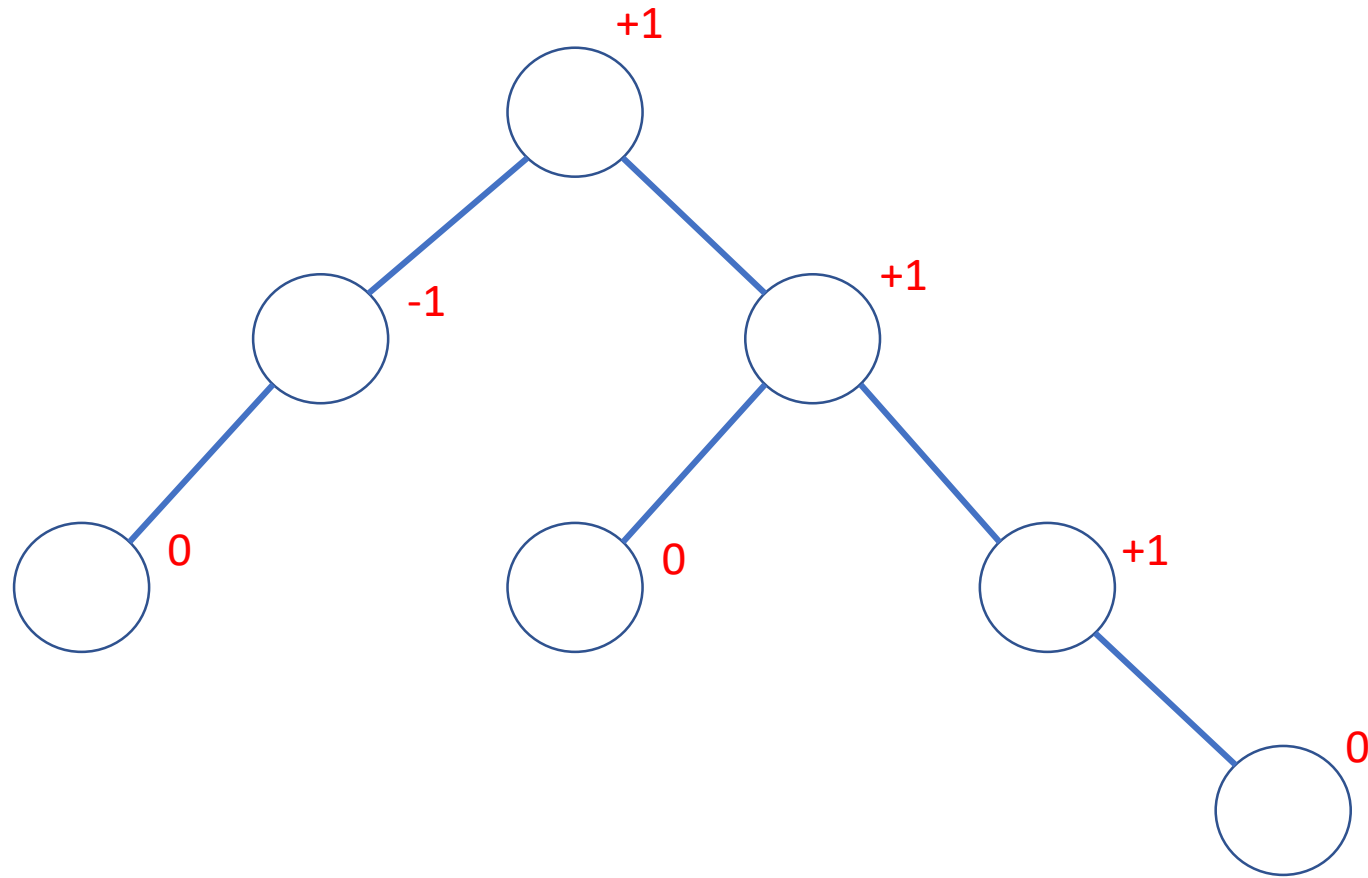
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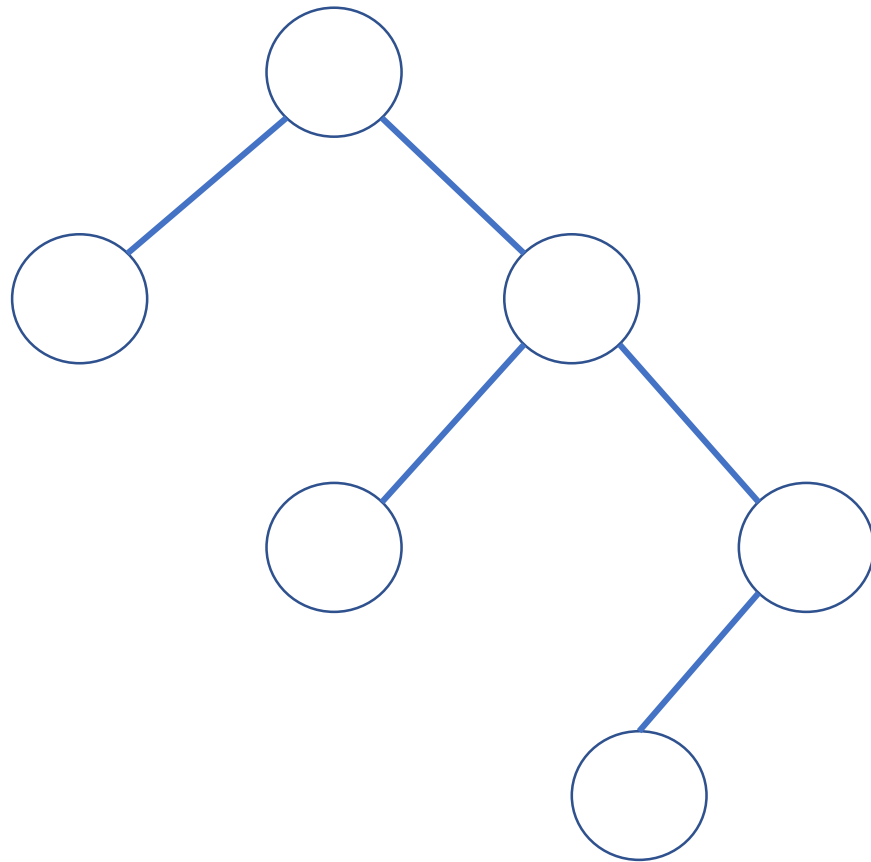
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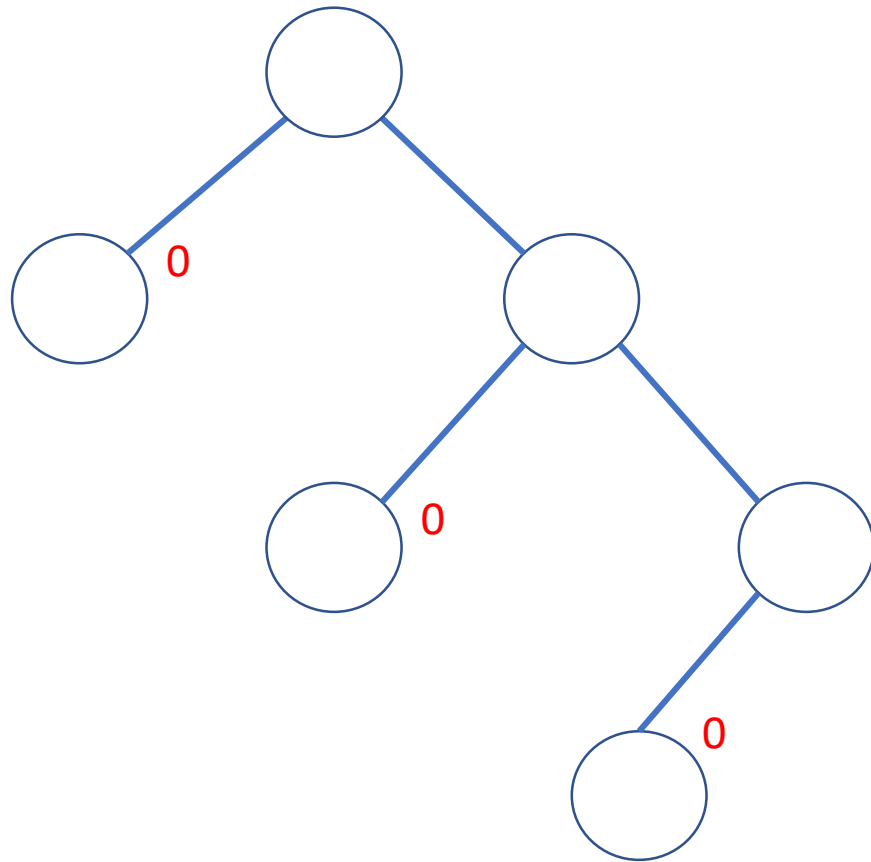
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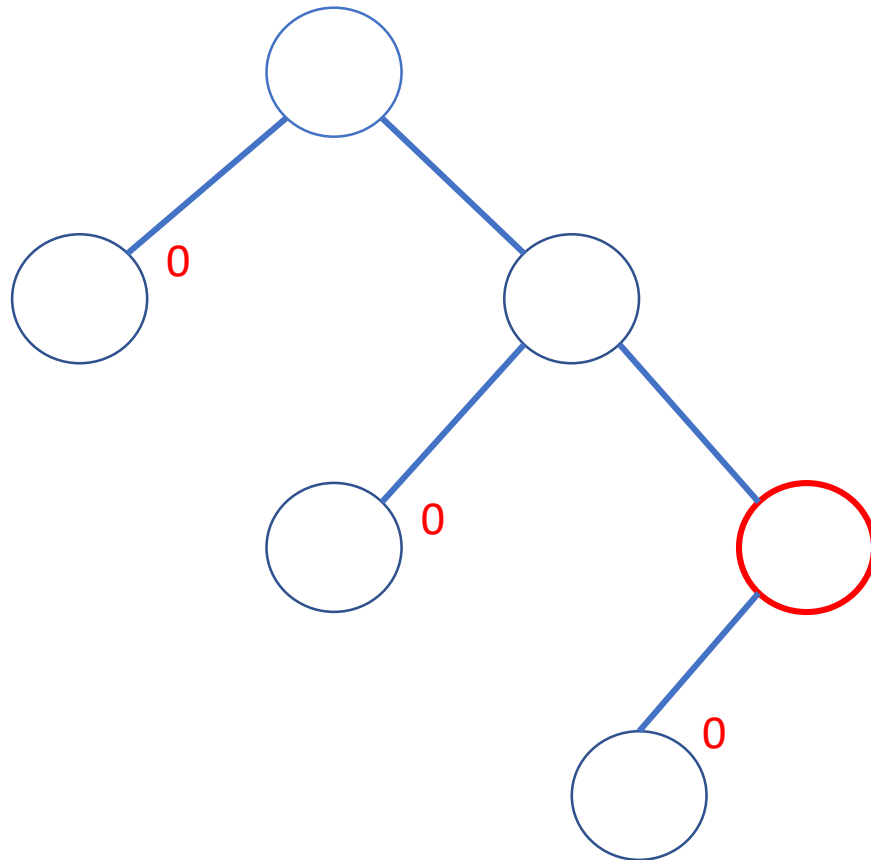
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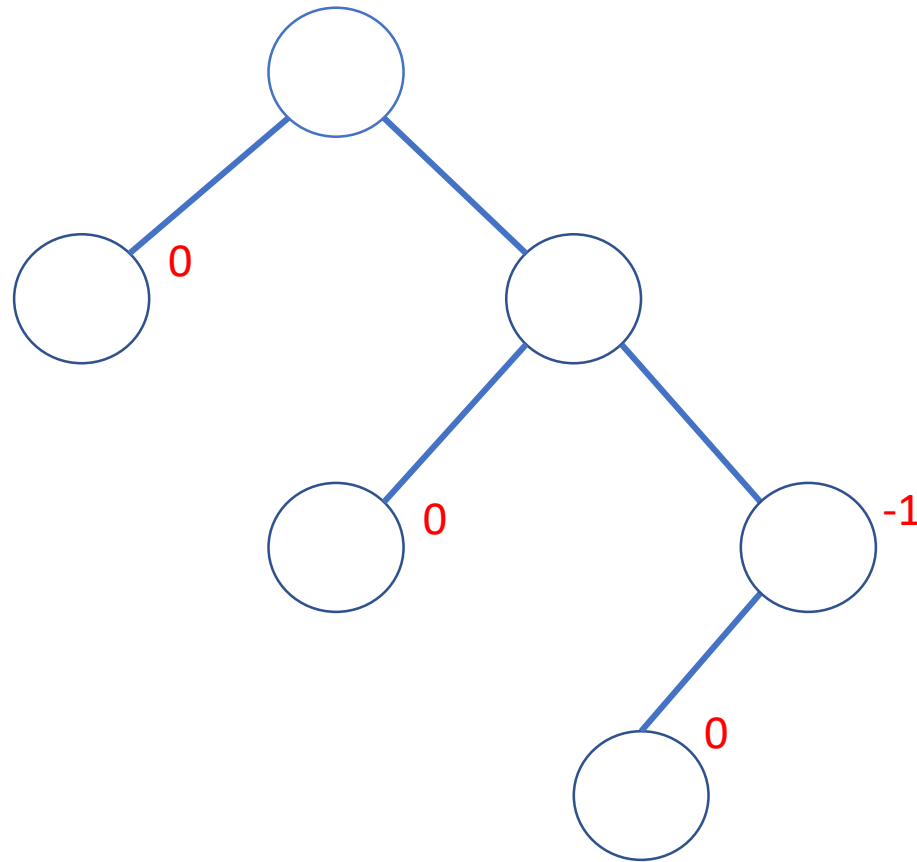
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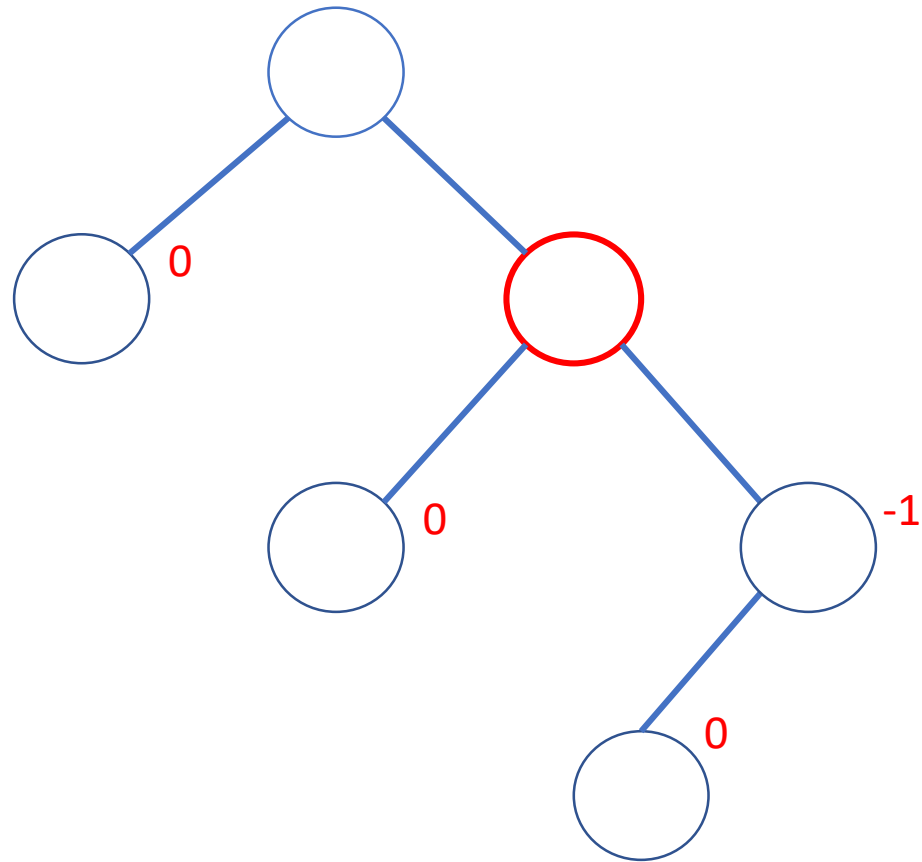
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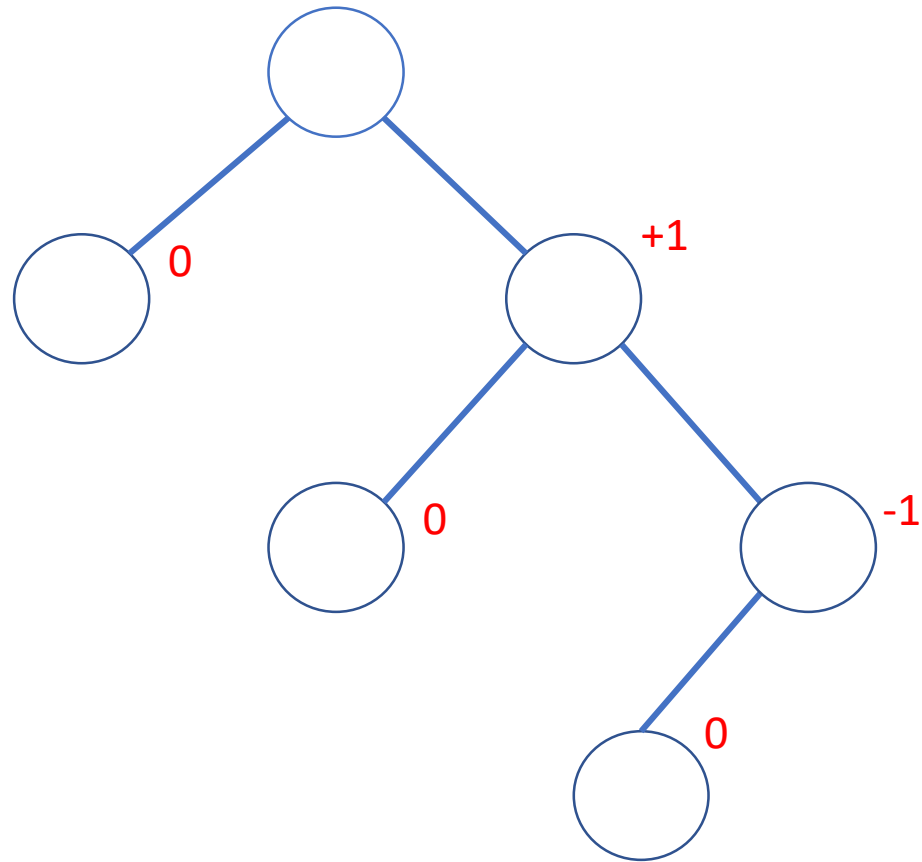
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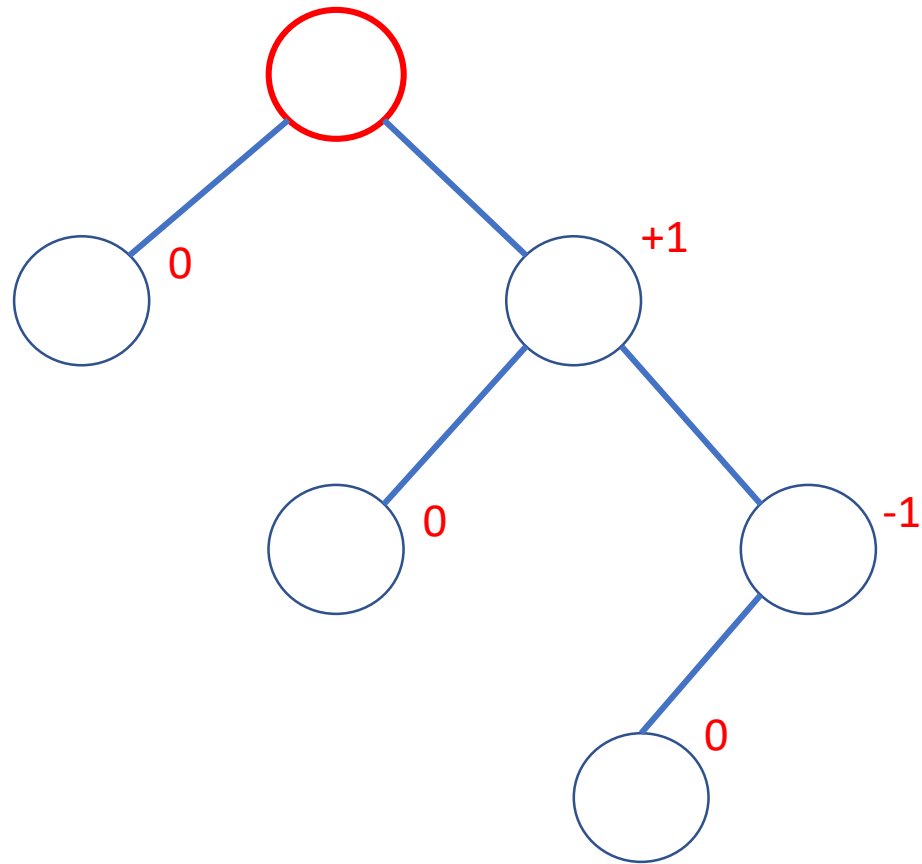
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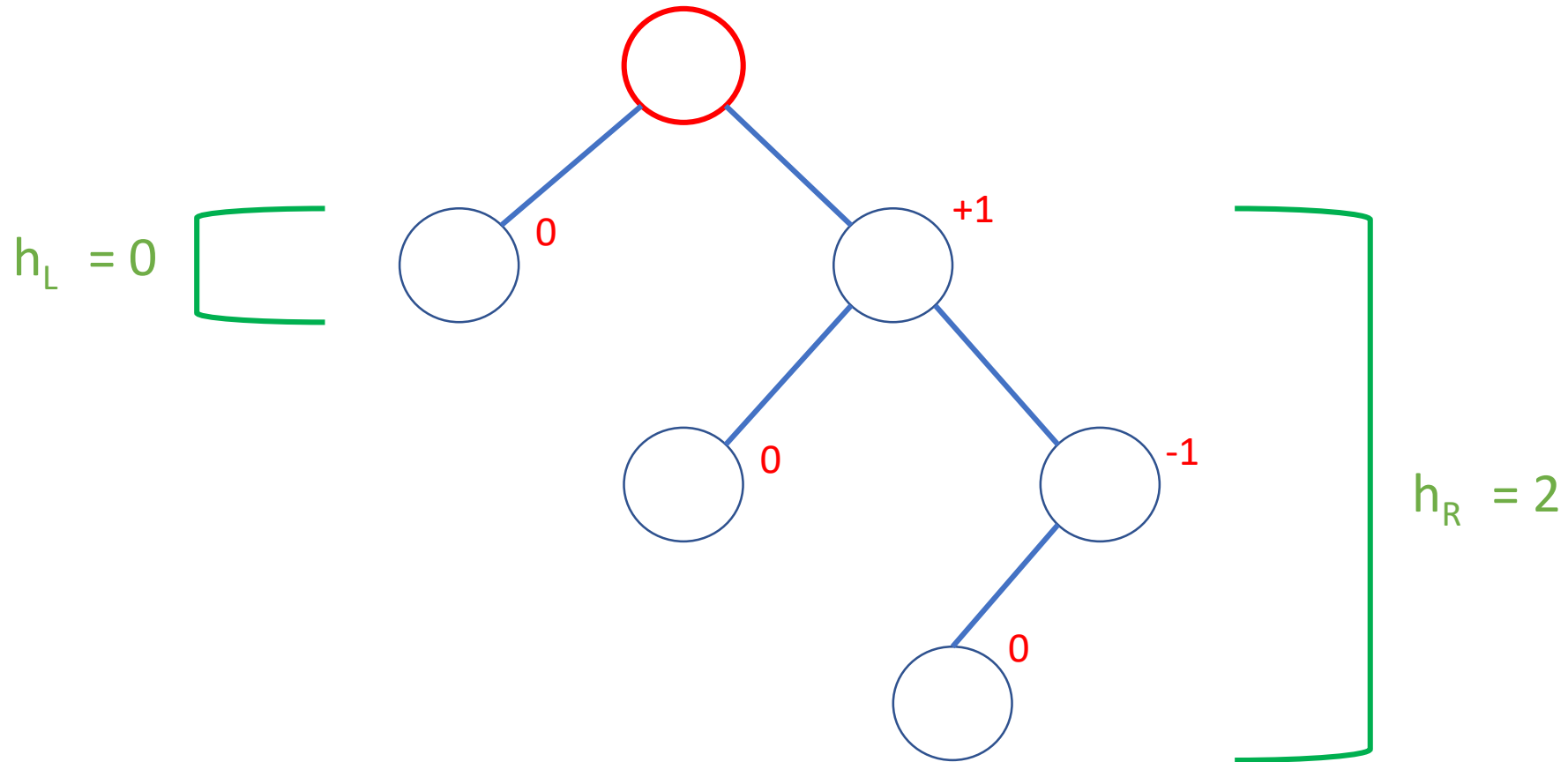
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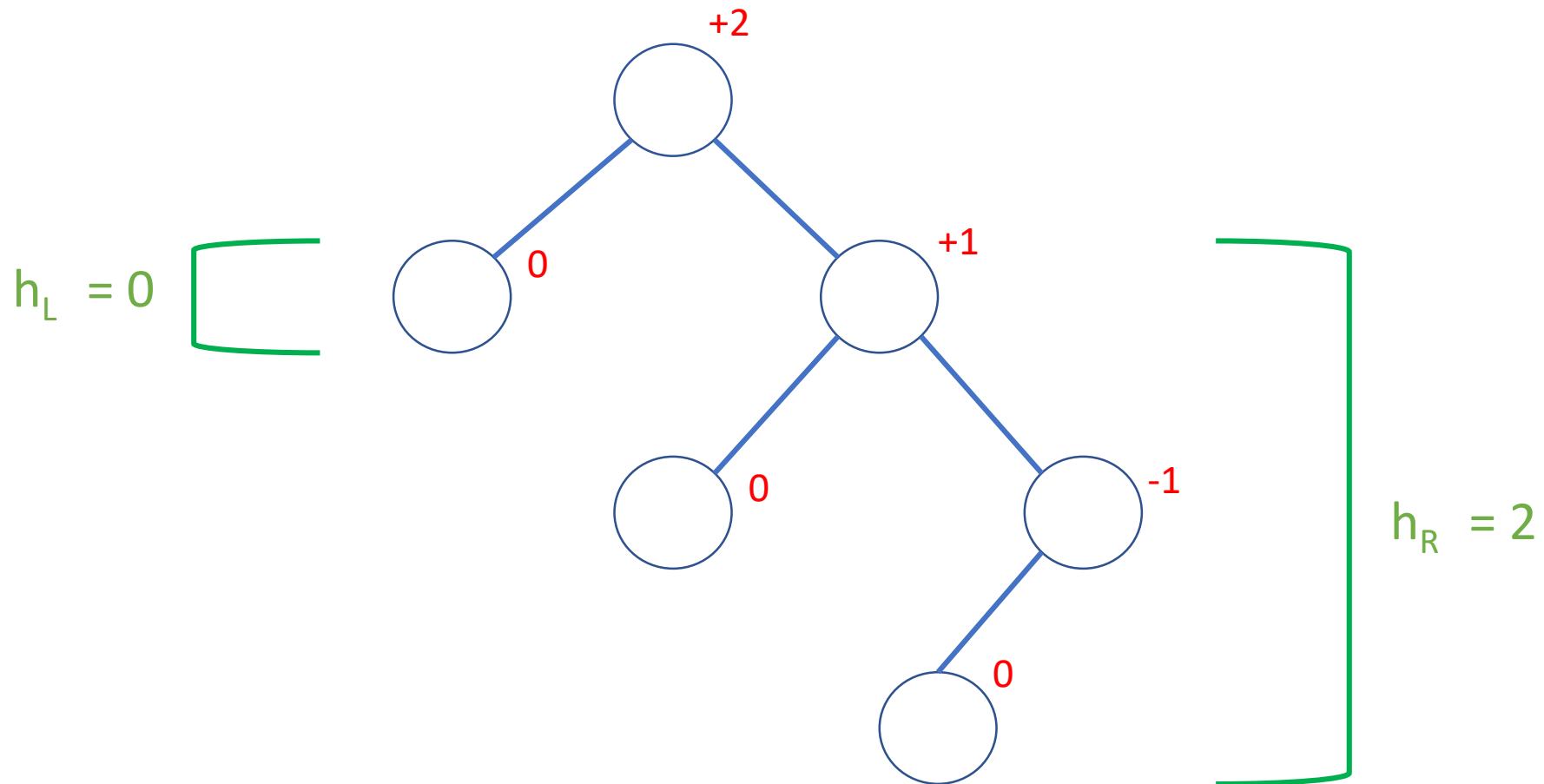
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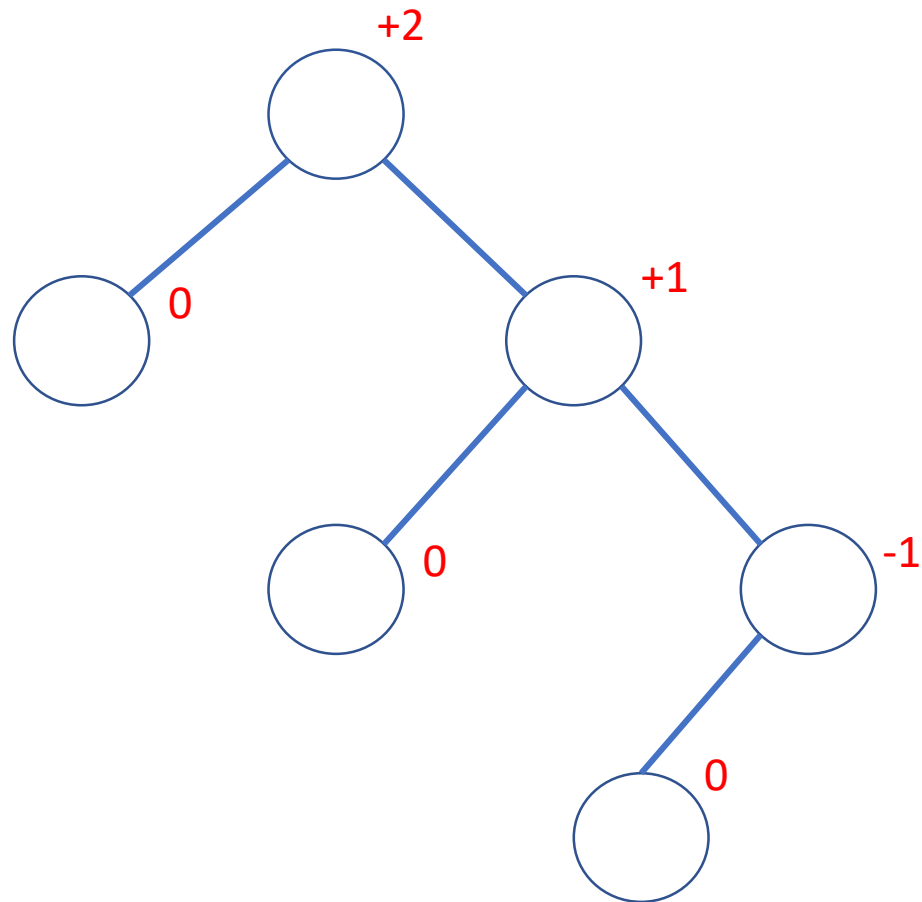
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Is this an AVL tree? **No!**



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- AVL trees of n nodes has height $\Theta(\log n)$ [height $\leq 1.44 \log_2(n+2)$]

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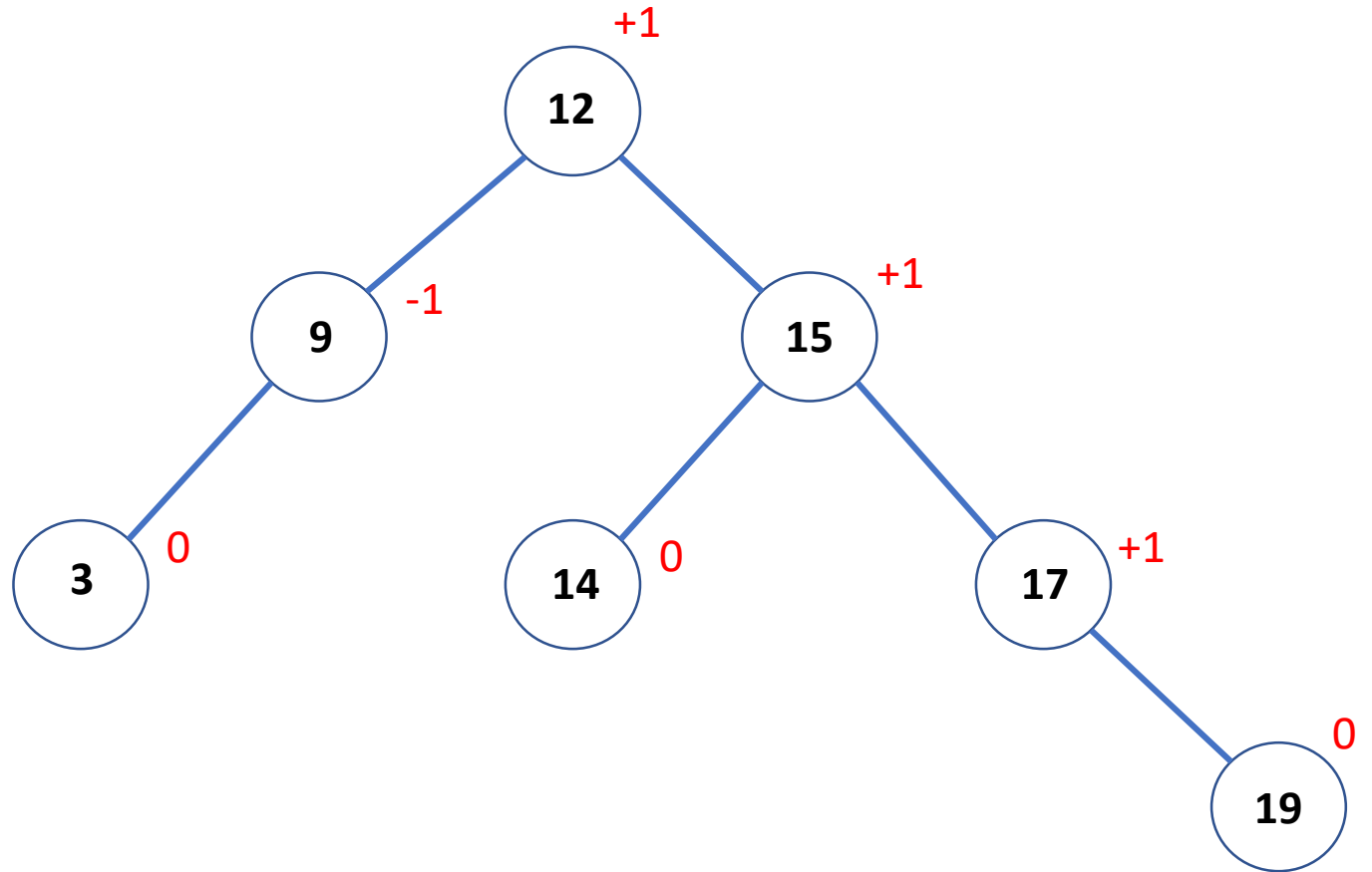
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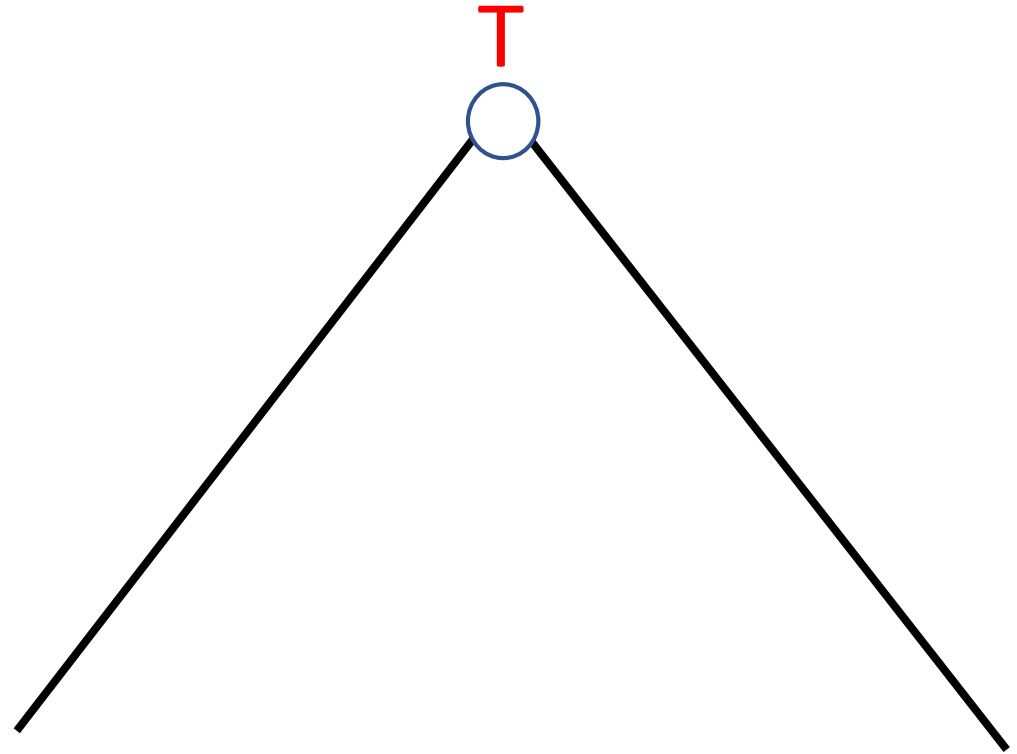
Elegant, relatively clean and simple, works well in practice

AVL tree operations

- **Search**(T, x)
- **Insert**(T, x)
- **Delete**(T, x)

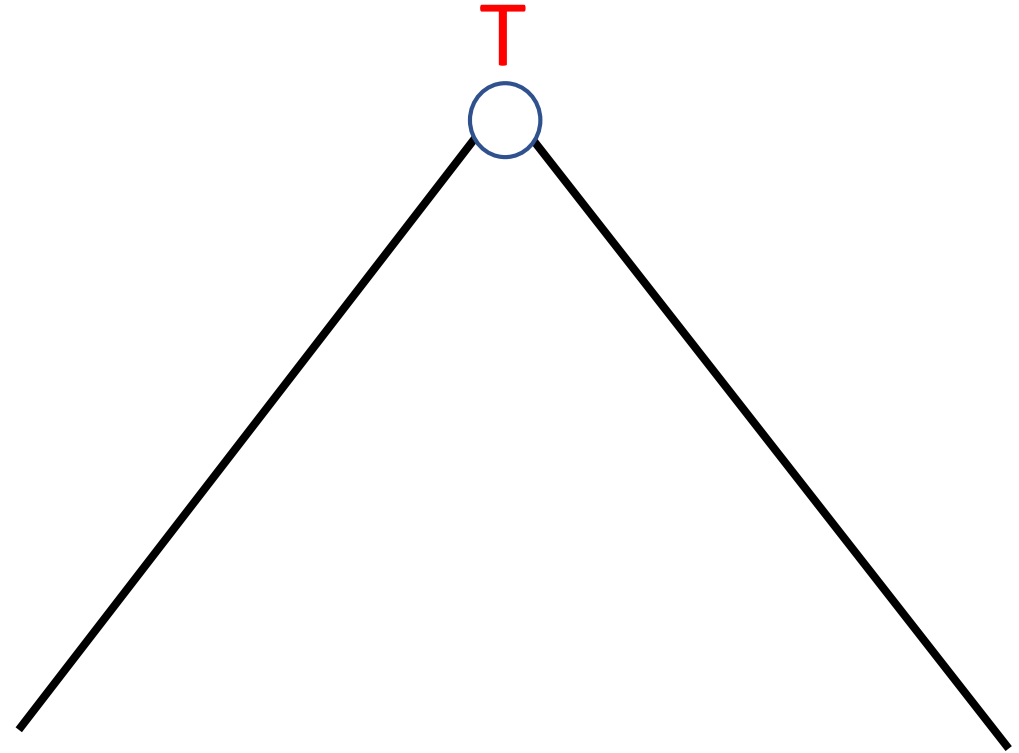


Insert(T, x) : General idea



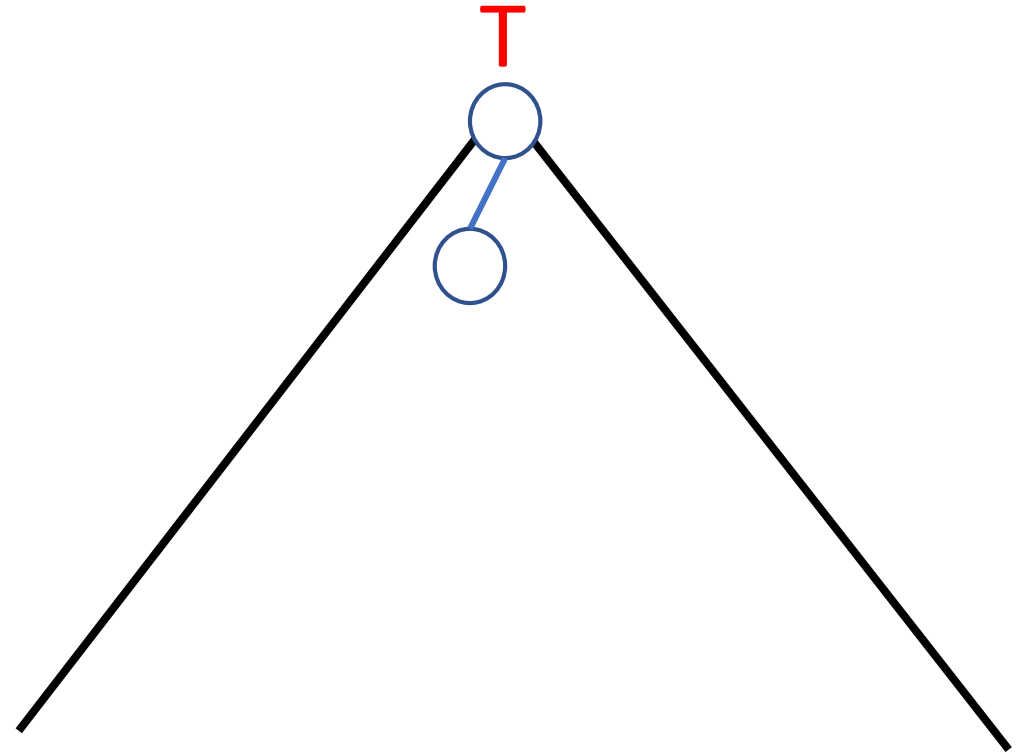
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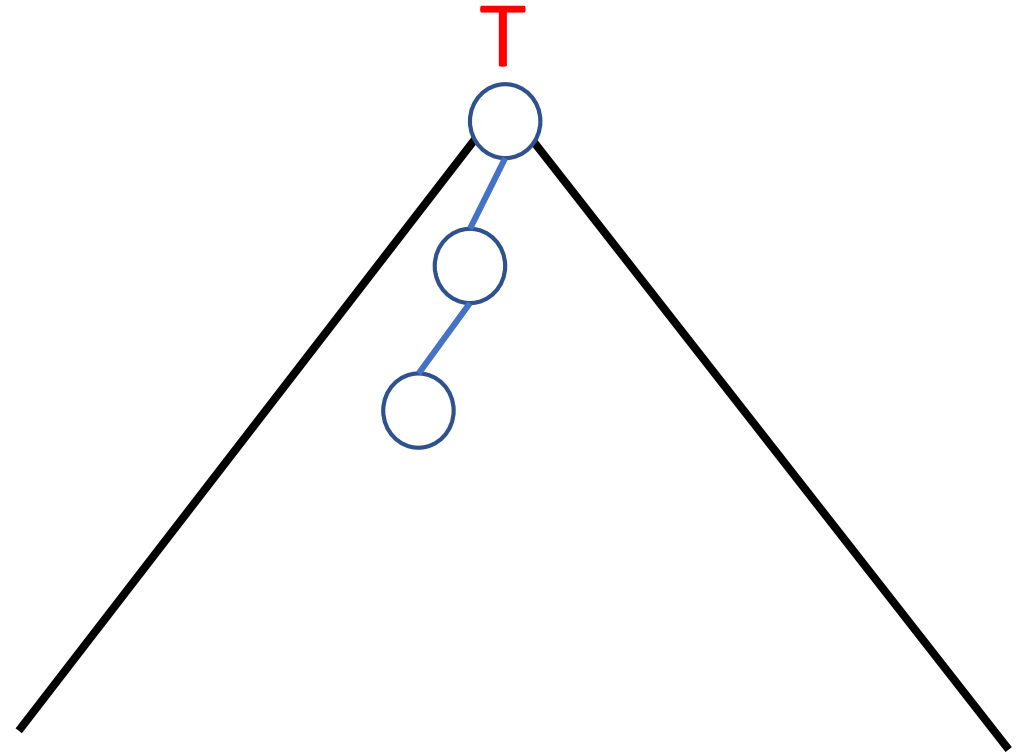
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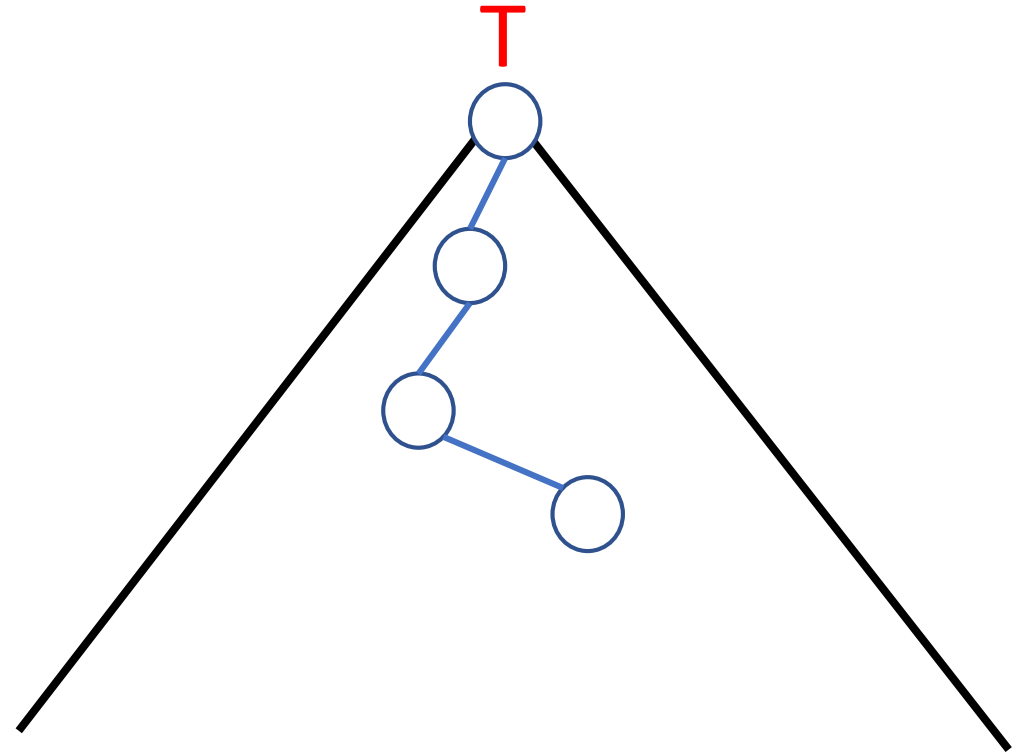
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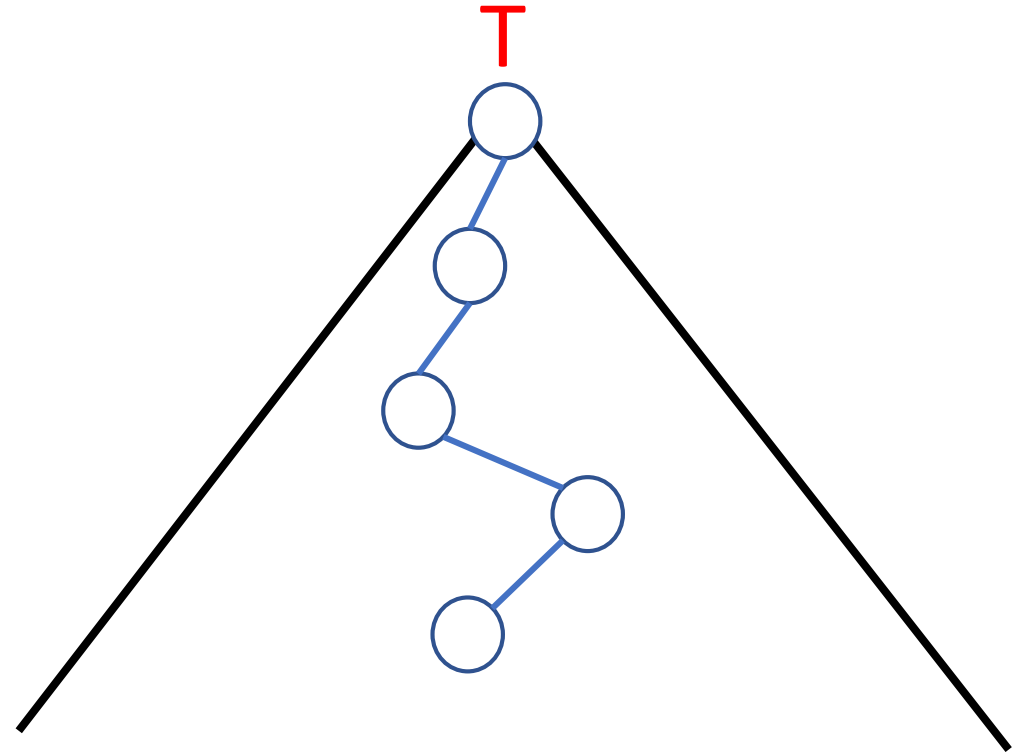
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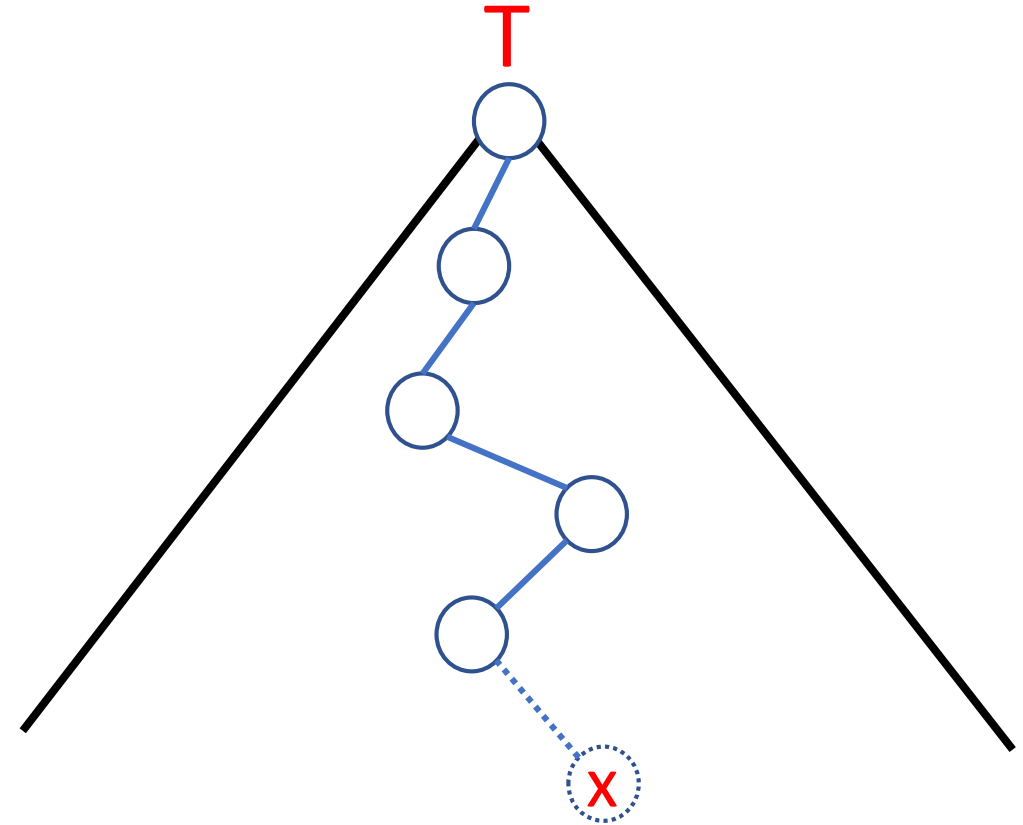
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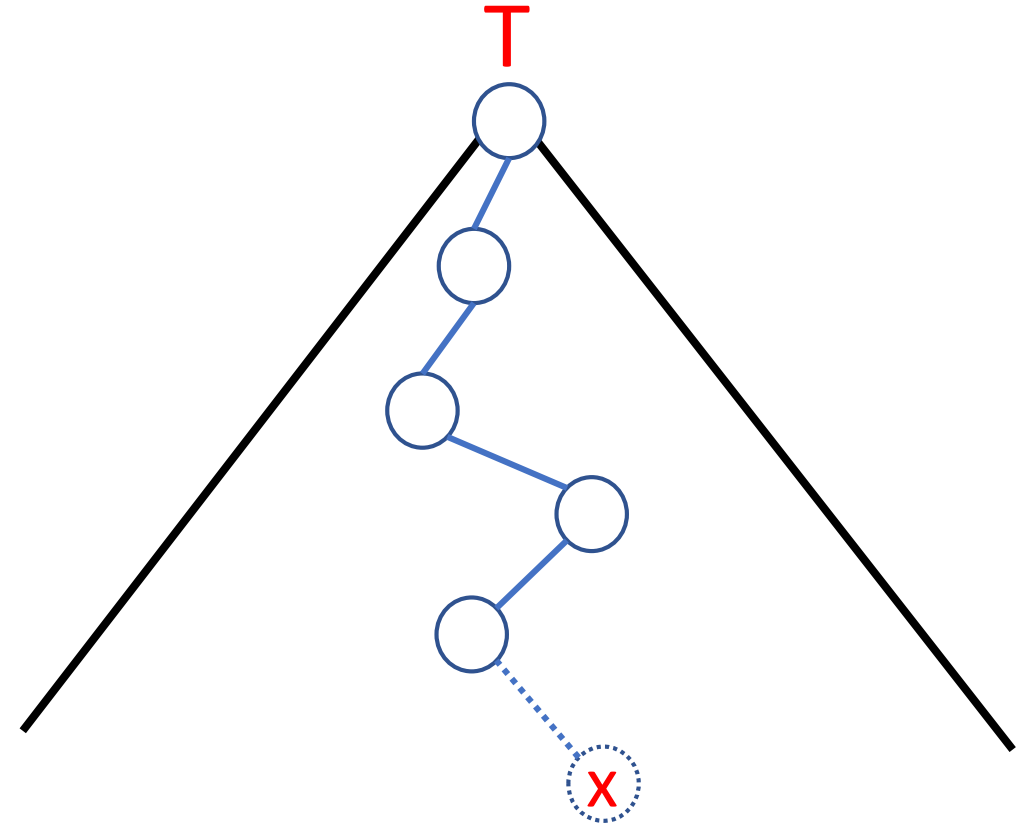
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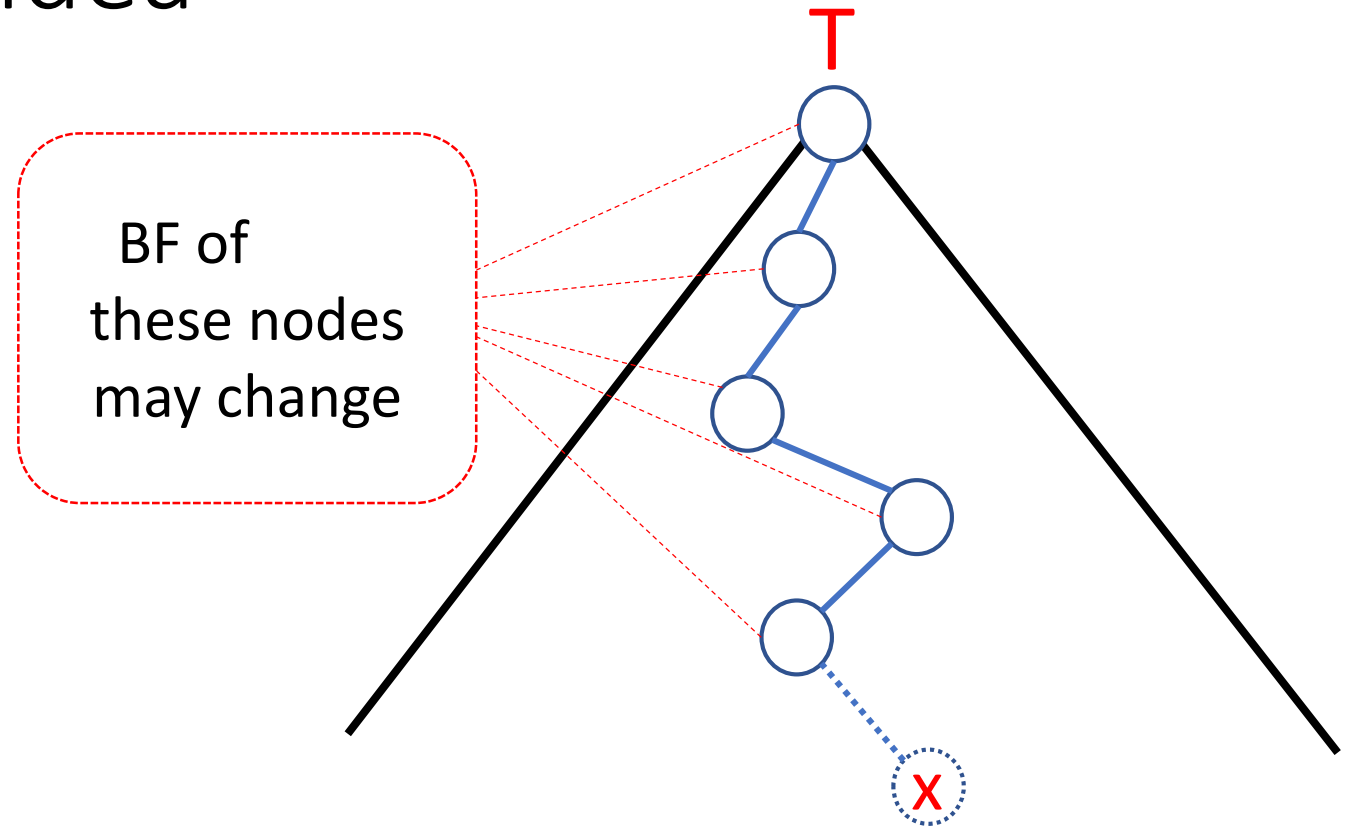
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf



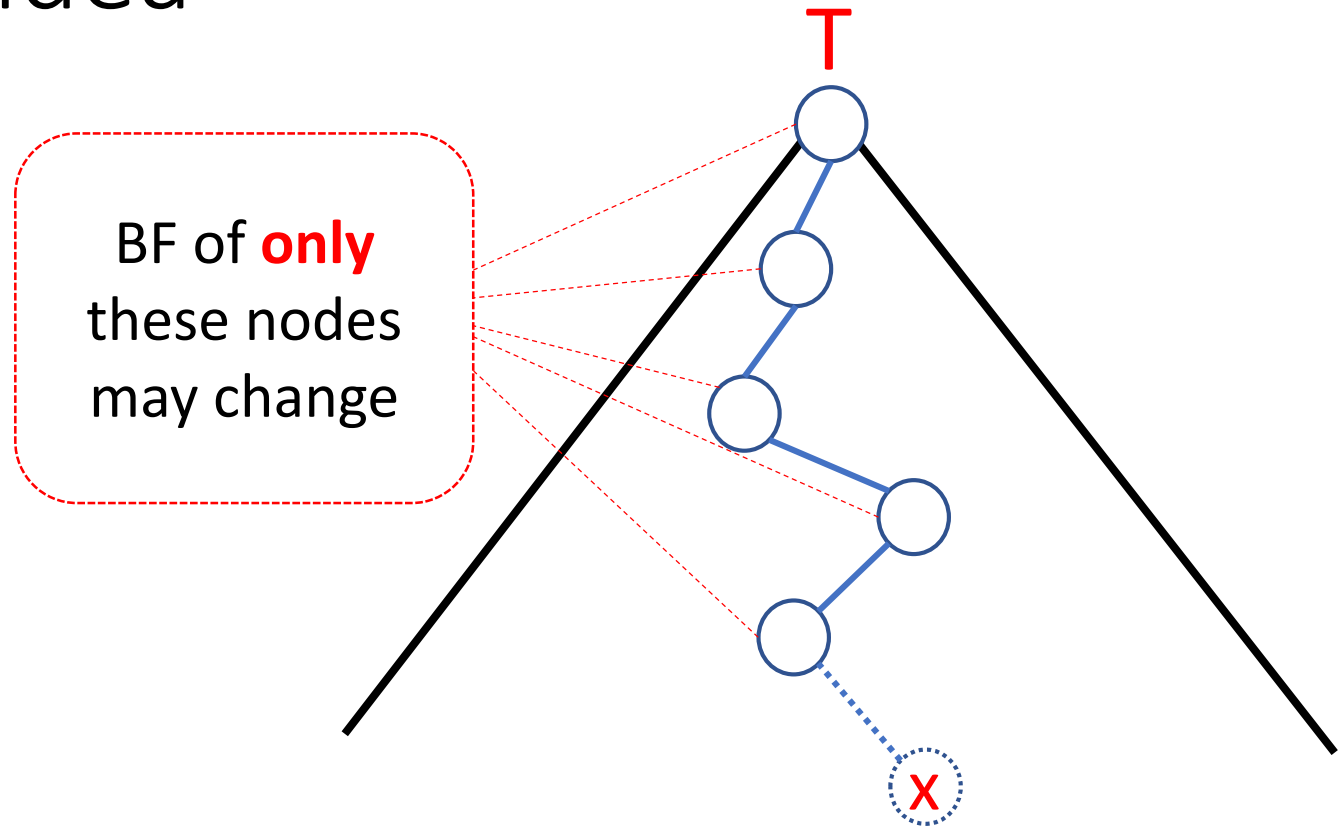
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf



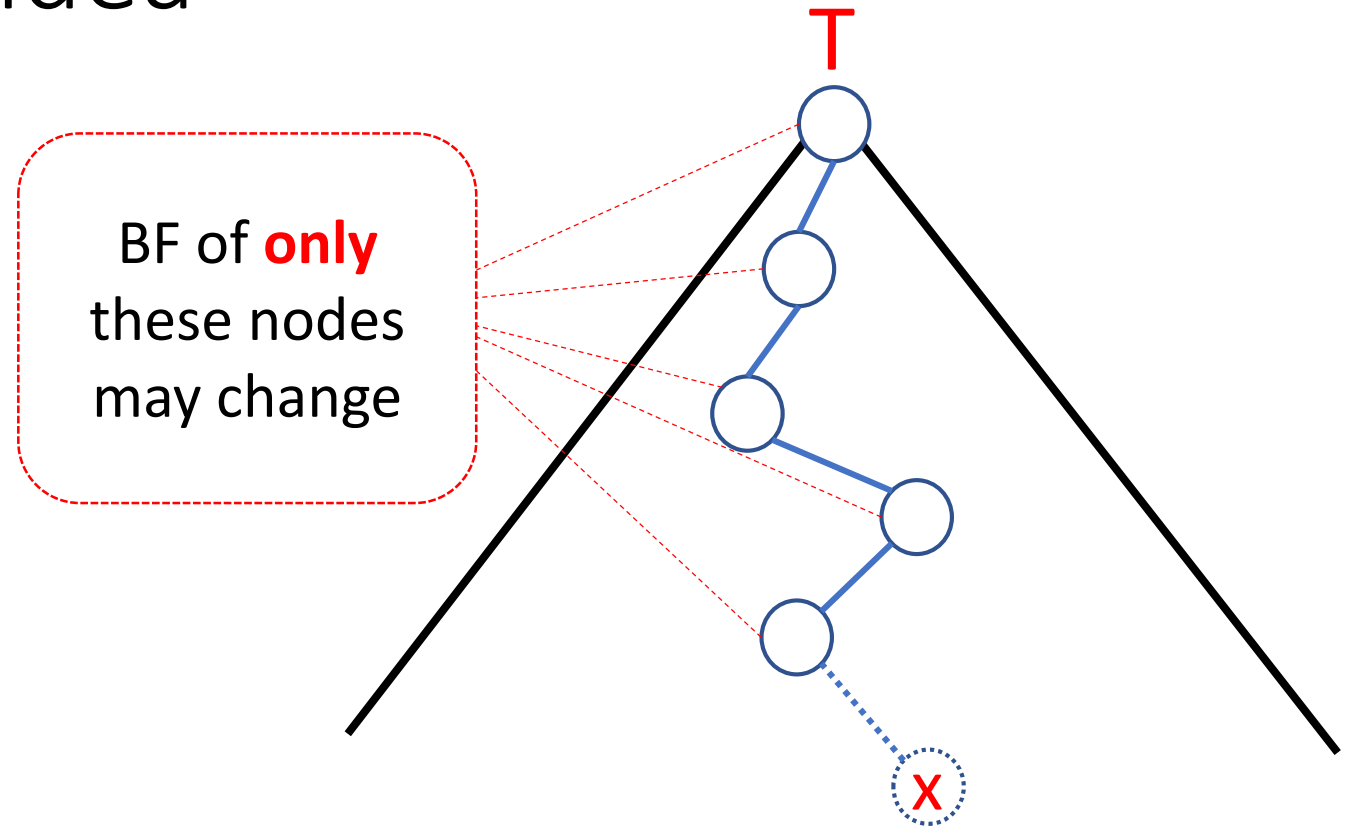
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf



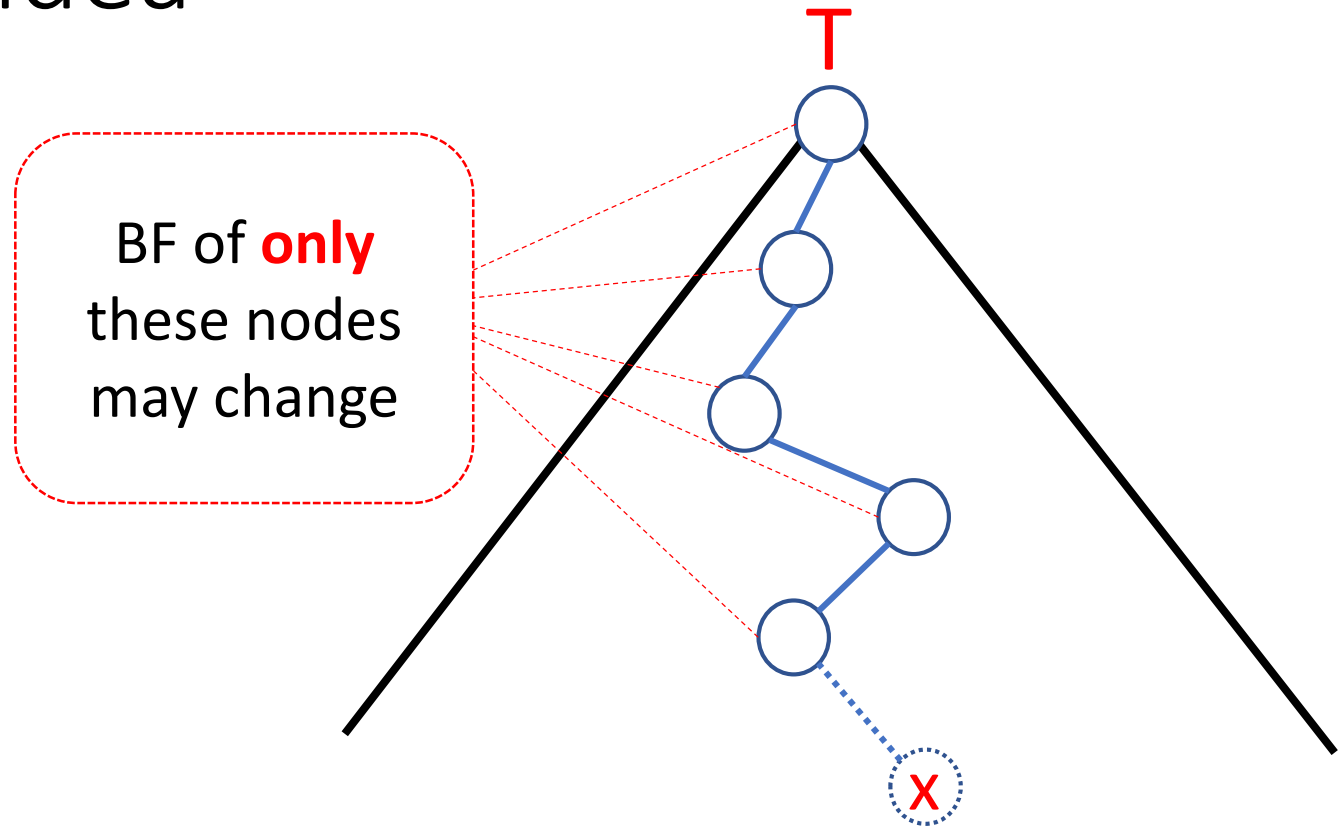
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf
- Go up from x to the root



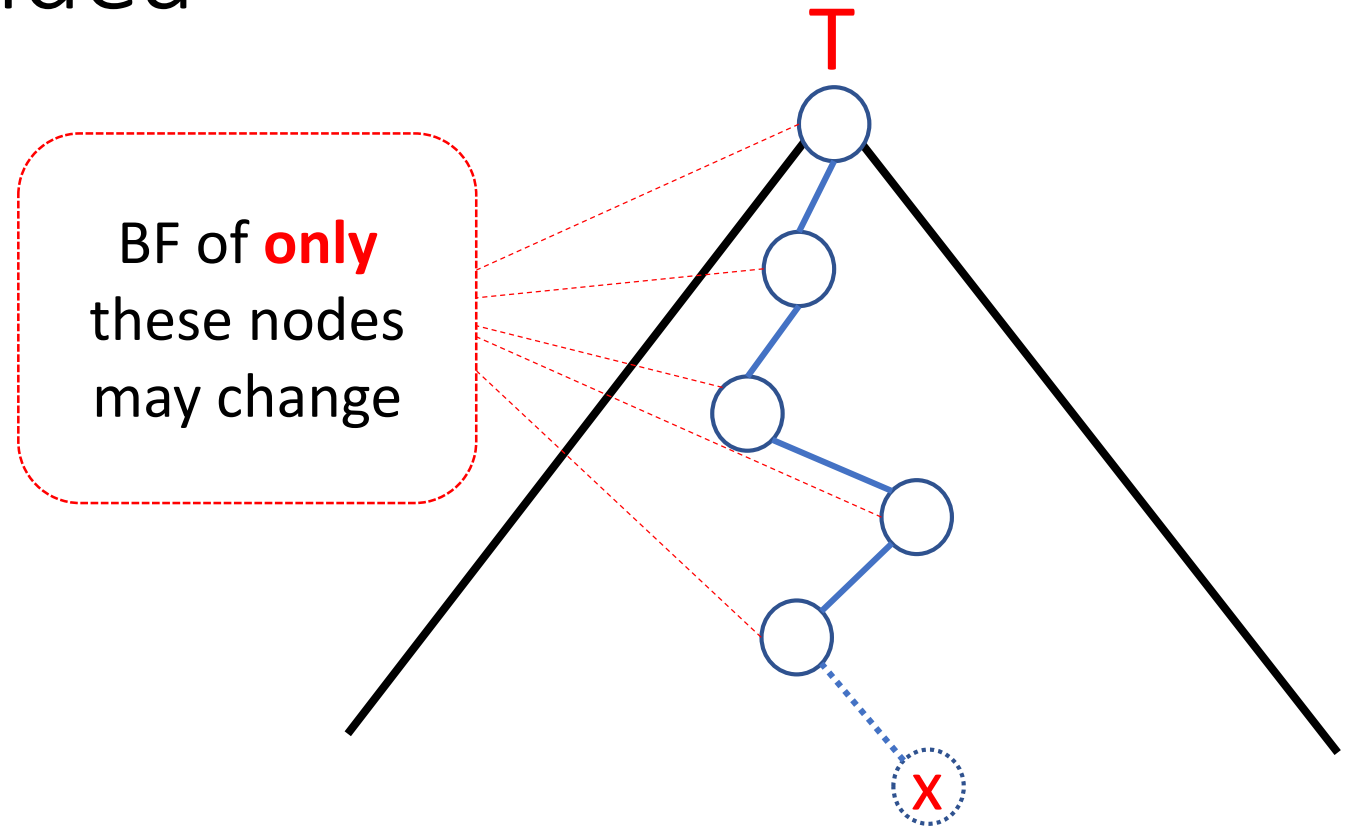
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf
- Go up from x to the root and for each node :



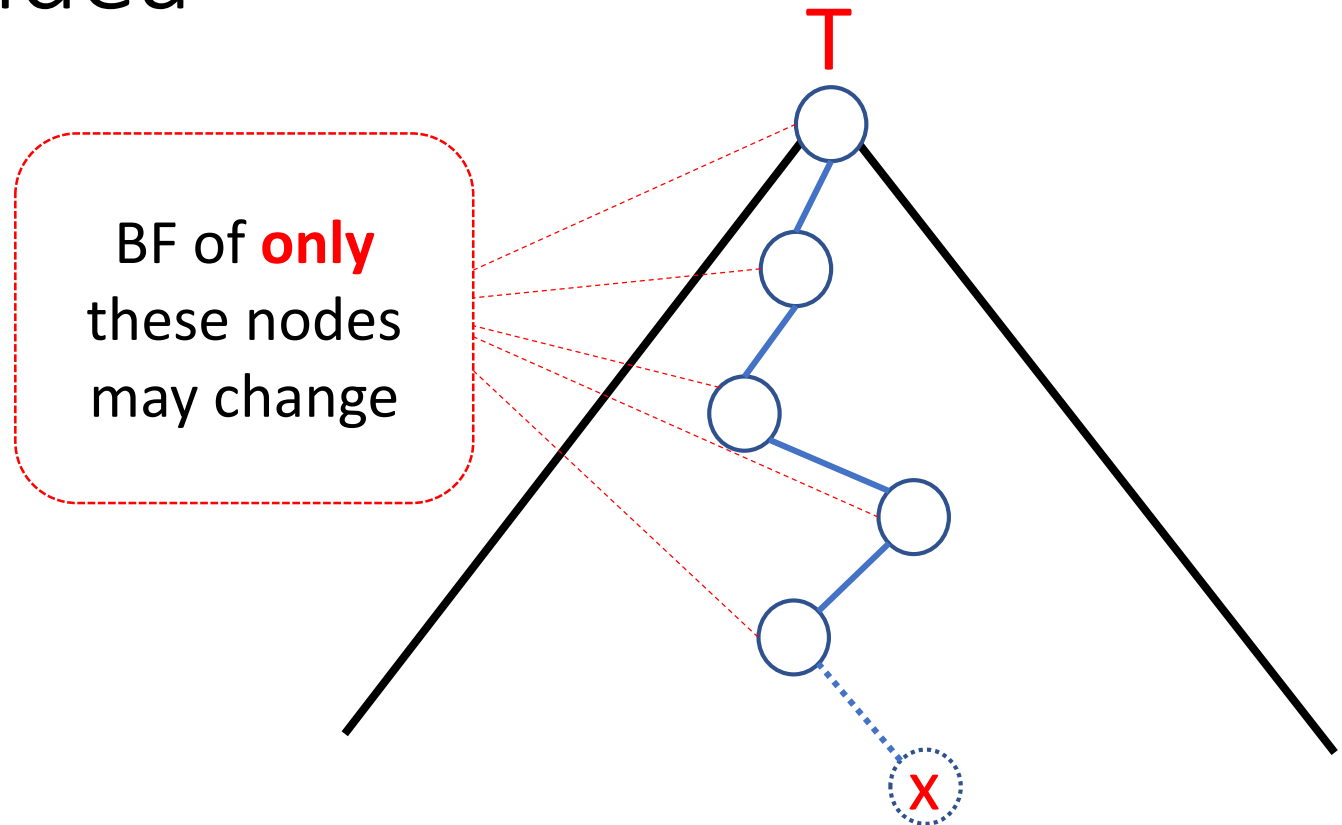
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf
- Go up from x to the root and for each node :
 - Adjust the BF



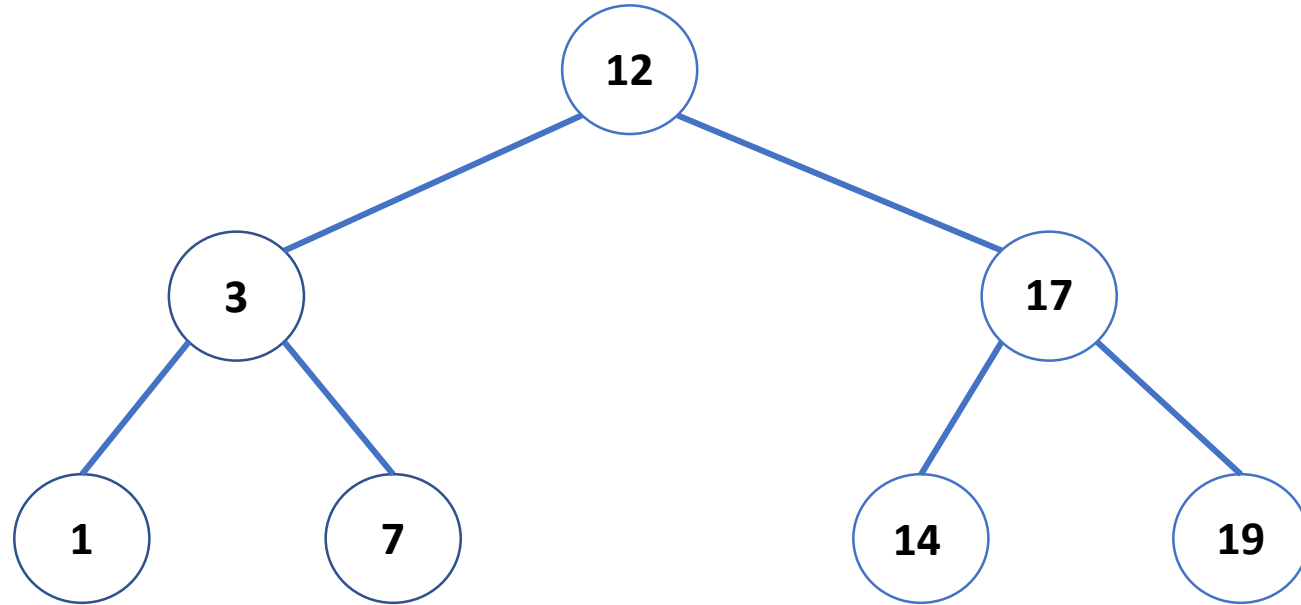
Insert(T, x) : General idea

- Insert x into T as in any BST :
 - x is now a leaf
- Go up from x to the root and for each node :
 - Adjust the BF
 - “Rebalance” if necessary
i.e. if $BF > 1$ or $BF < -1$

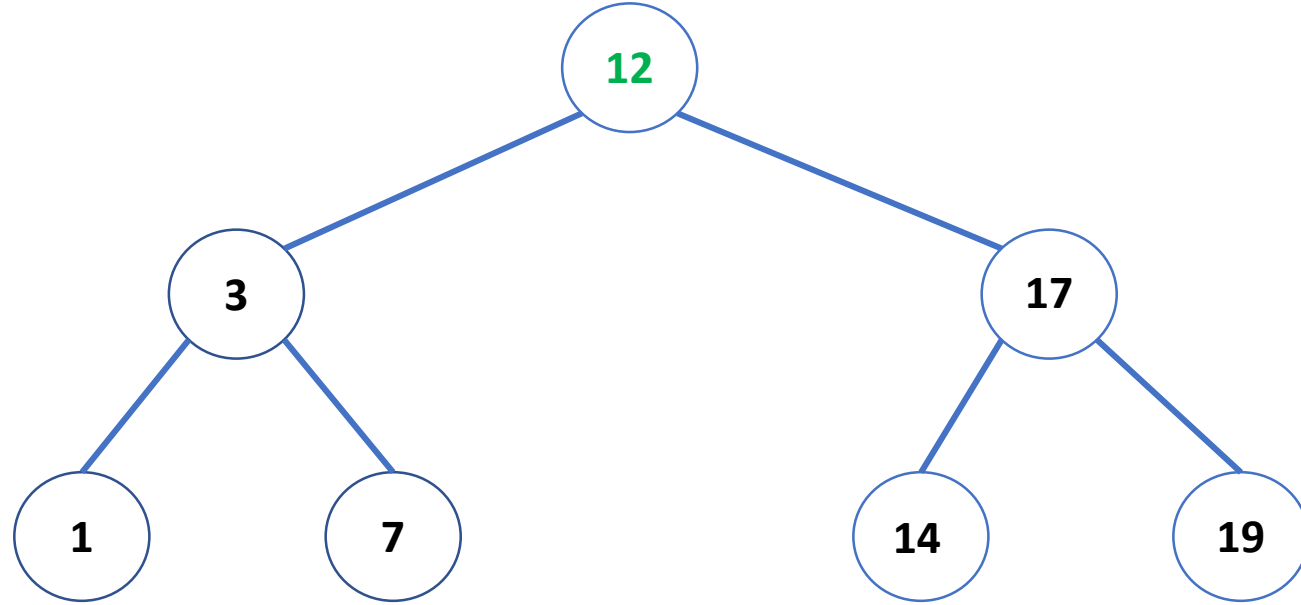


Example: AVL of {1, 3, 7, 12, 14, 17, 19}

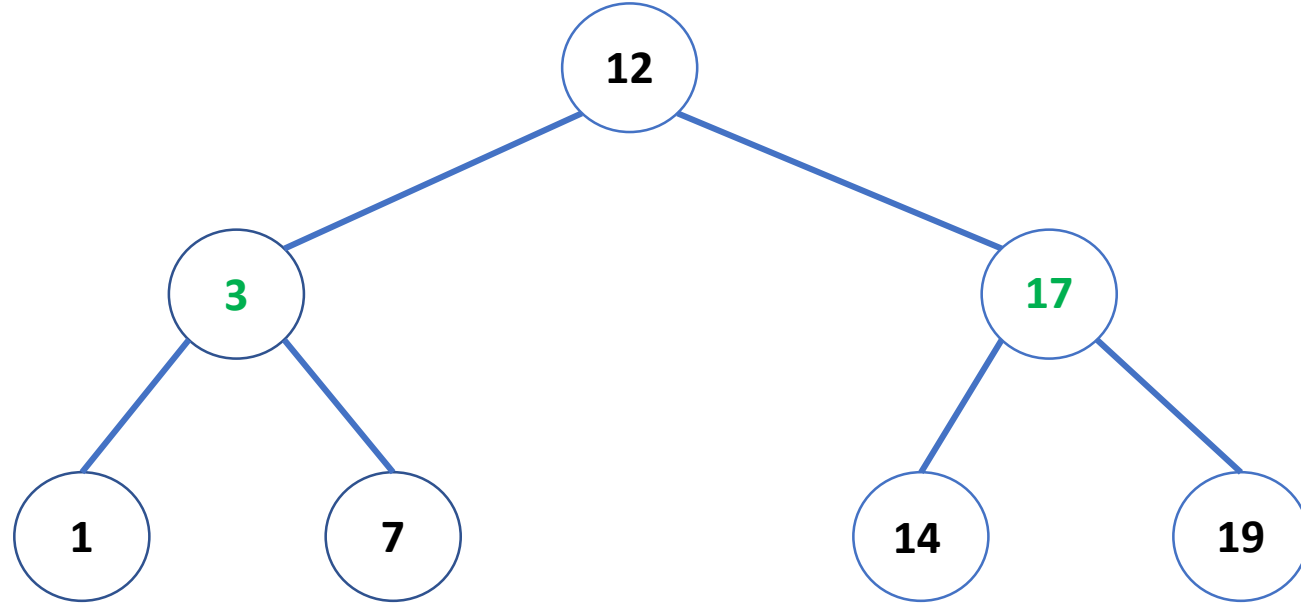
Example: AVL of {1, 3, 7, 12, 14, 17, 19}



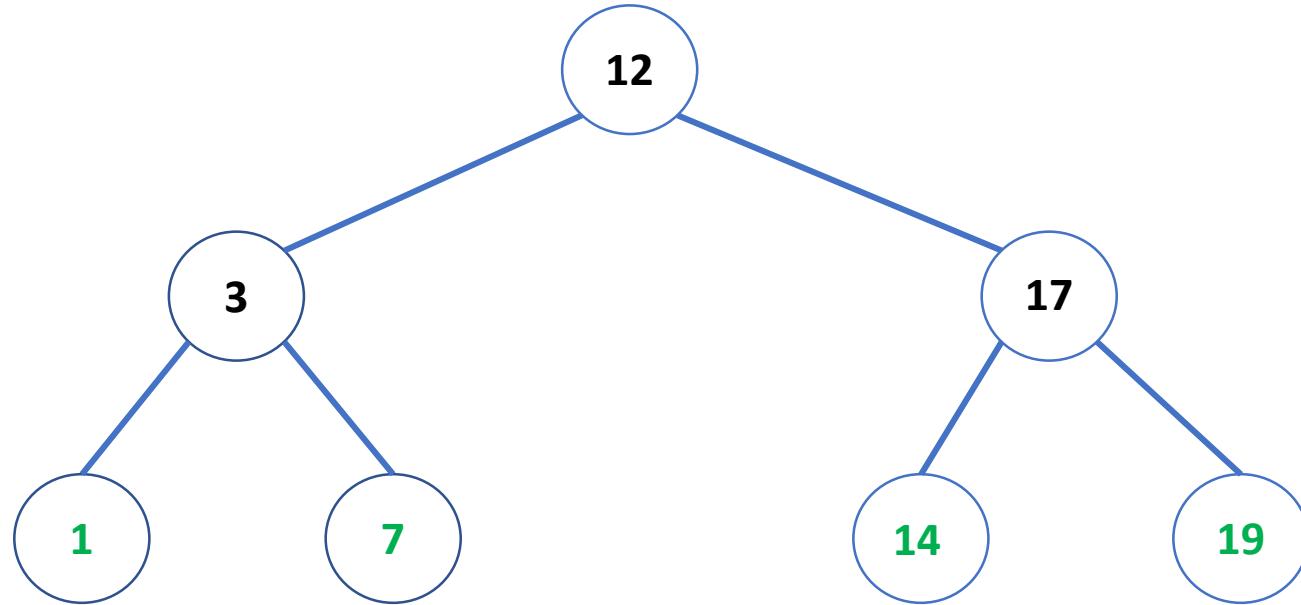
Example: AVL of {1, 3, 7, 12, 14, 17, 19}



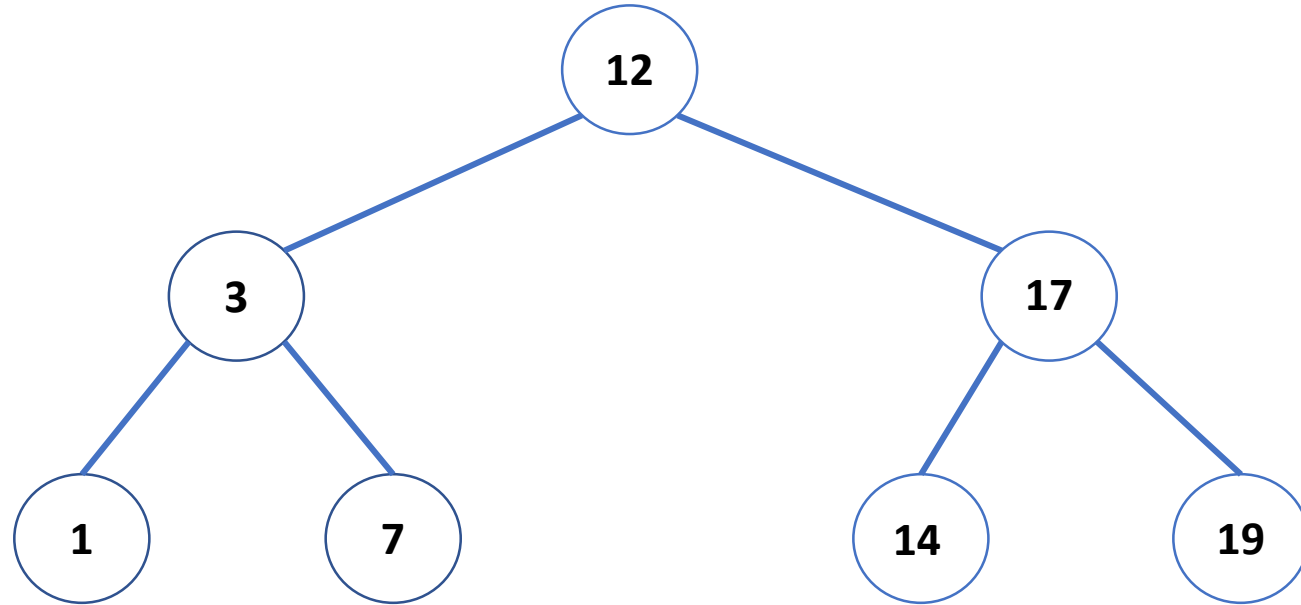
Example: AVL of {1, 3, 7, 12, 14, 17, 19}



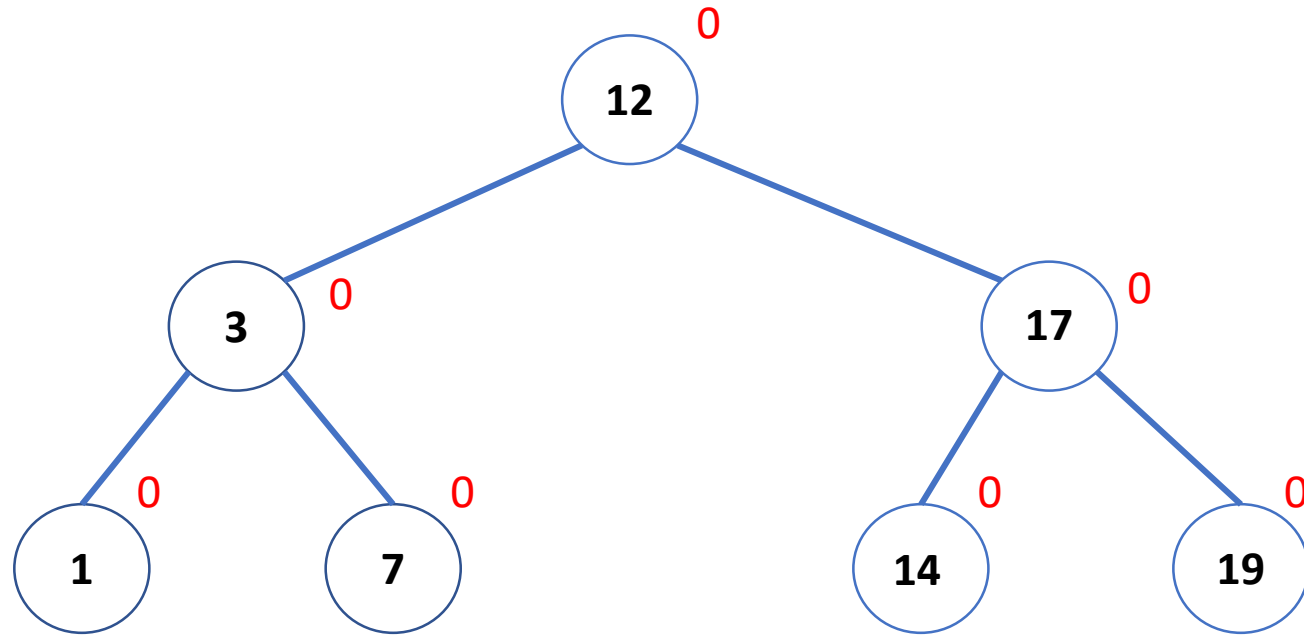
Example: AVL of {1, 3, 7, 12, 14, 17, 19}



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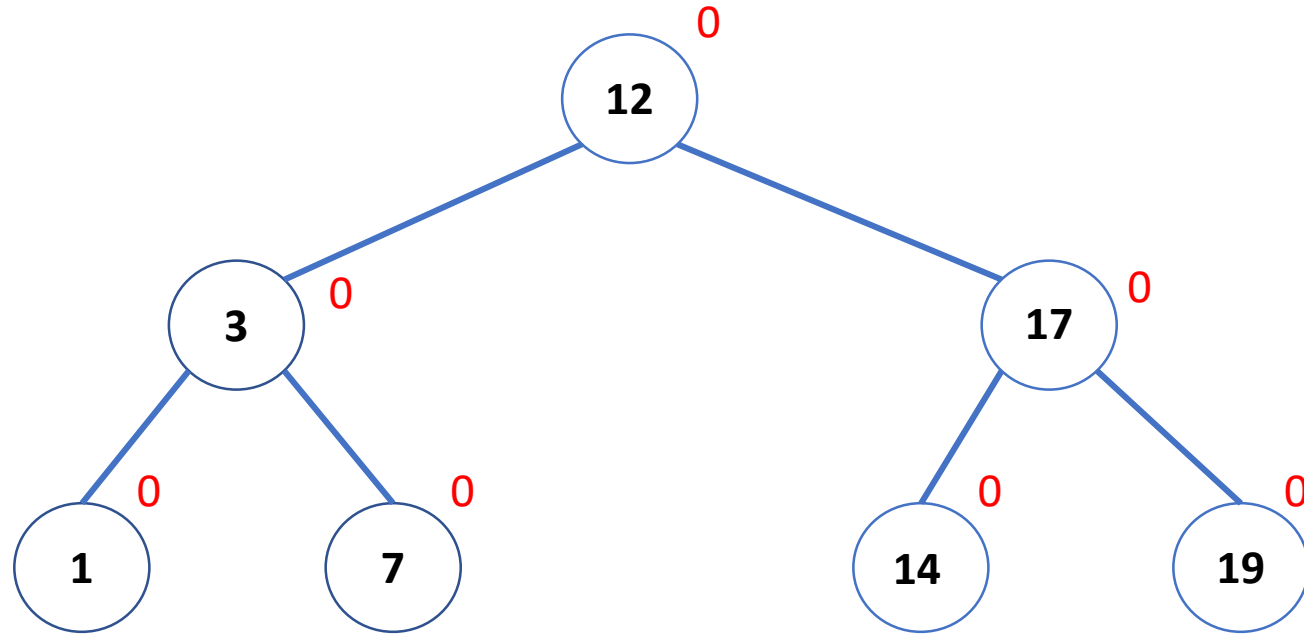


Example: AVL of {1, 3, 7, 12, 14, 17, 19}



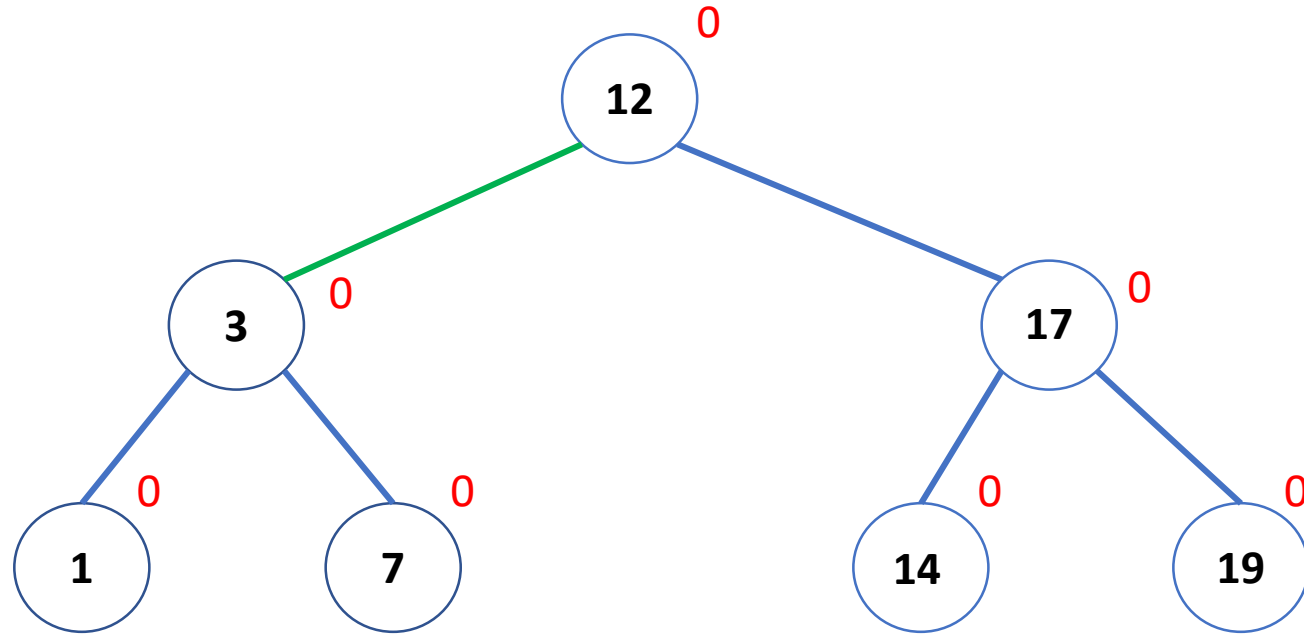
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



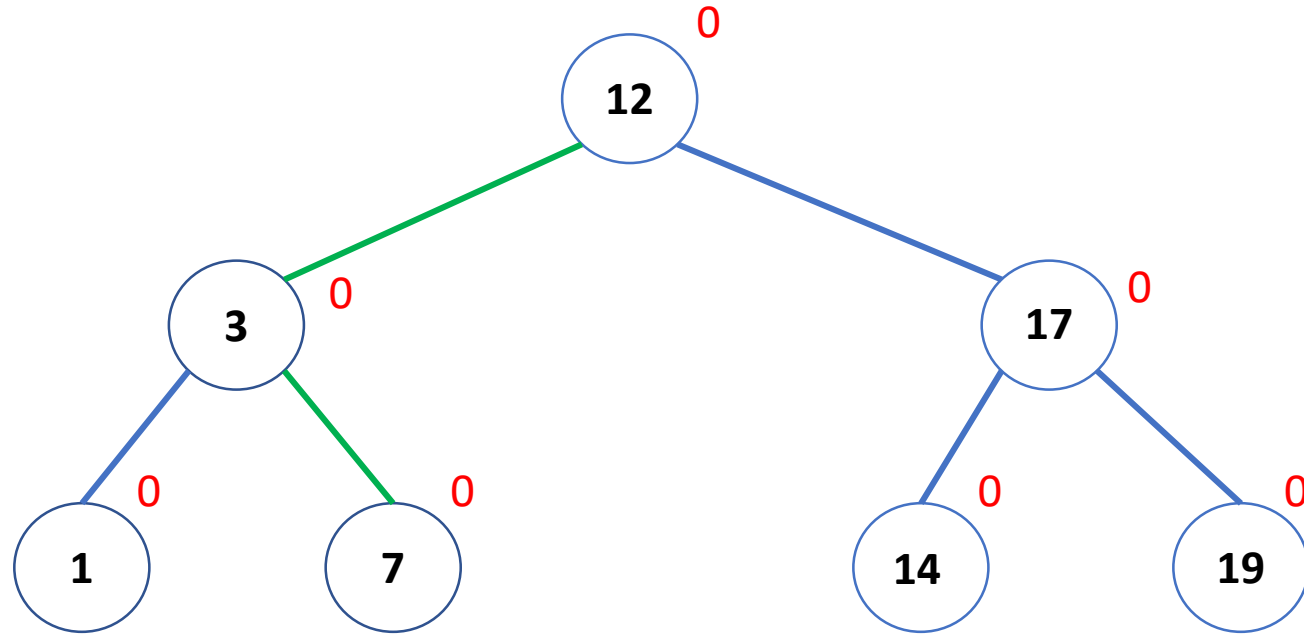
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



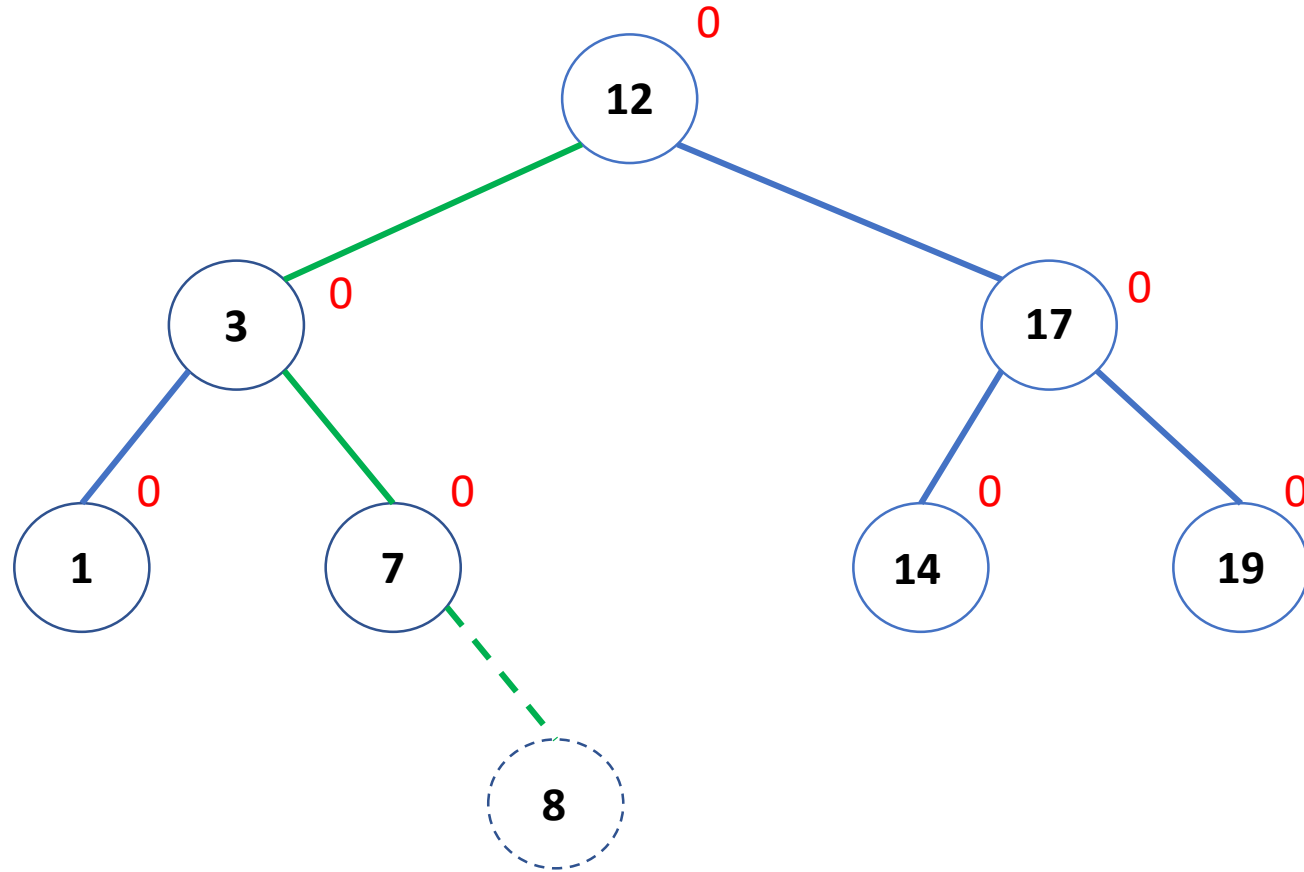
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



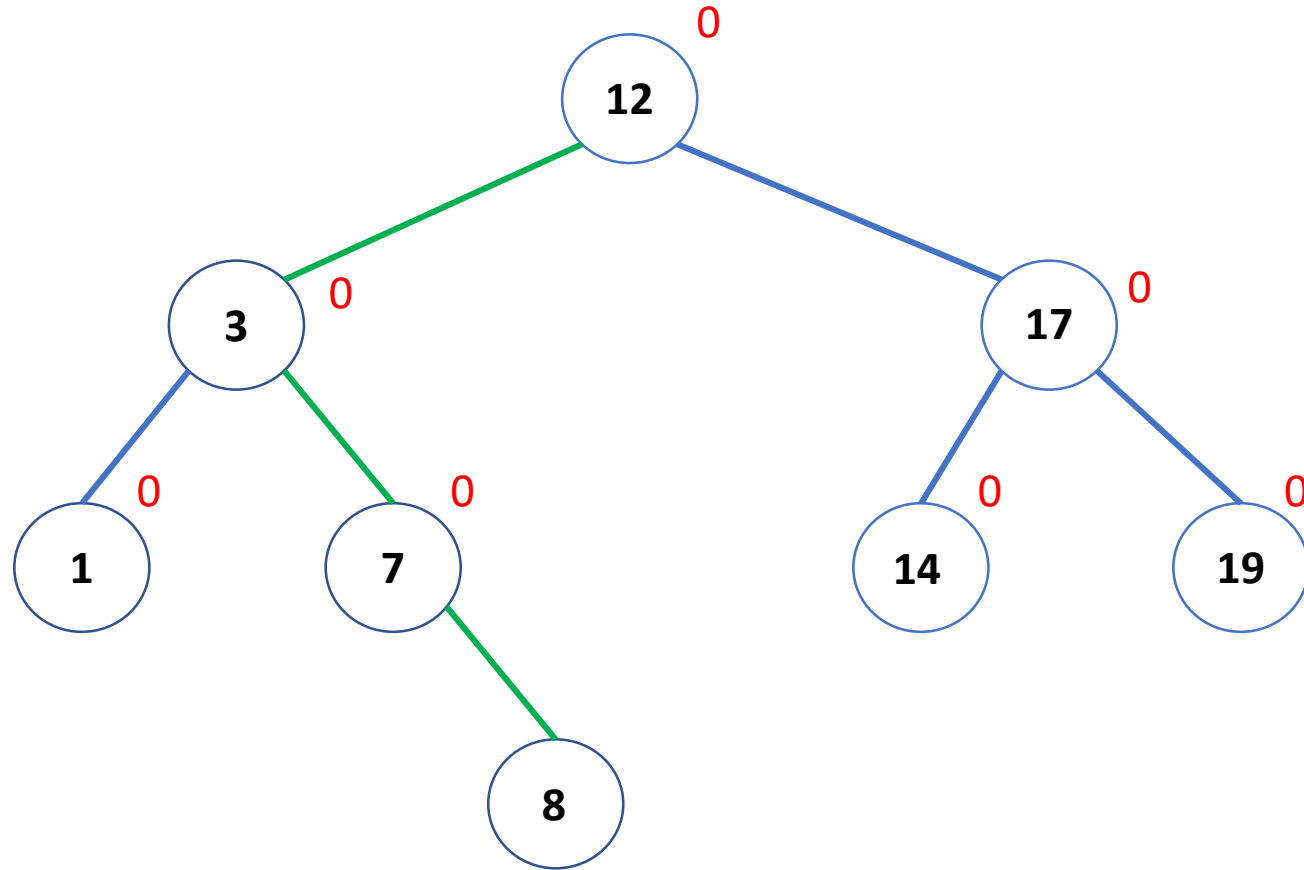
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



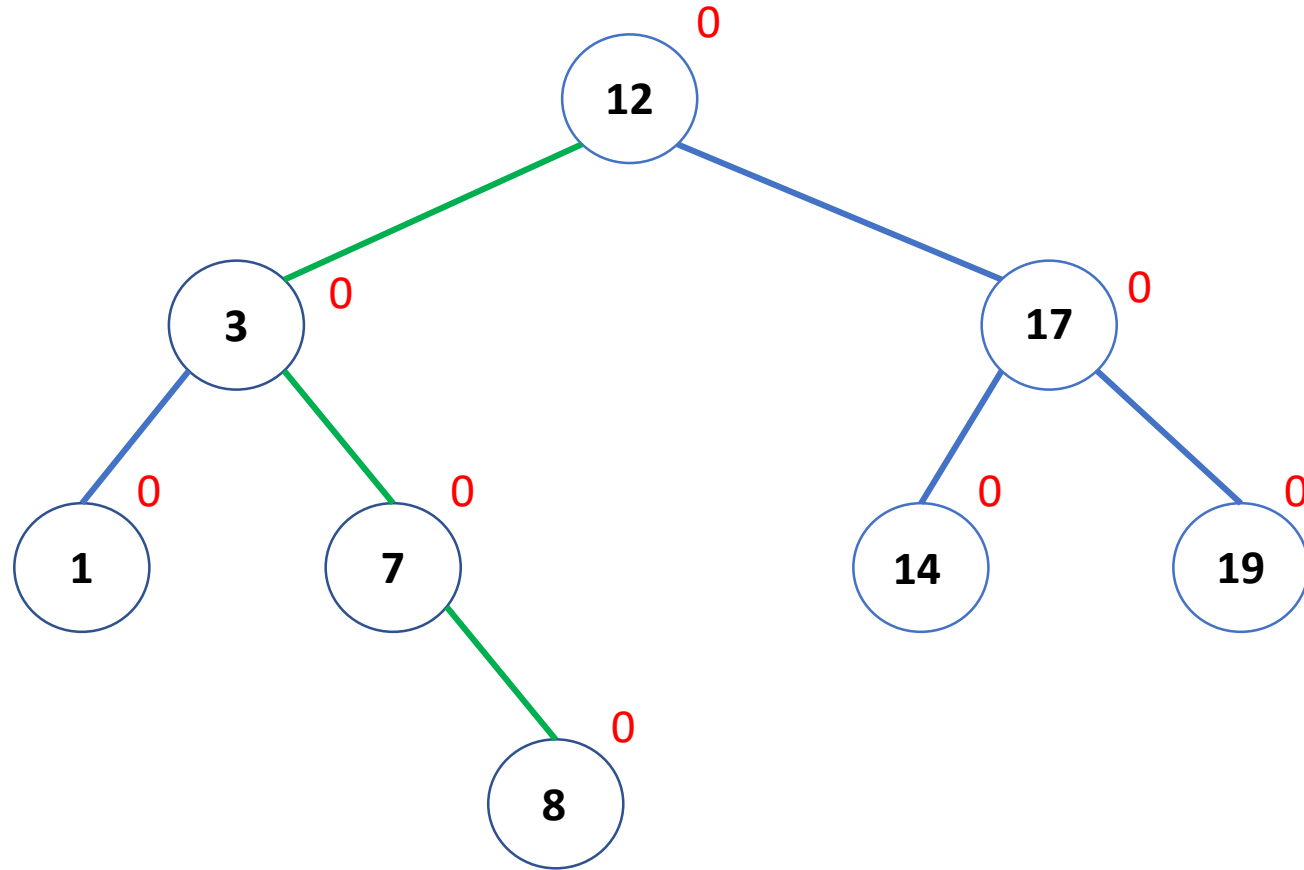
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



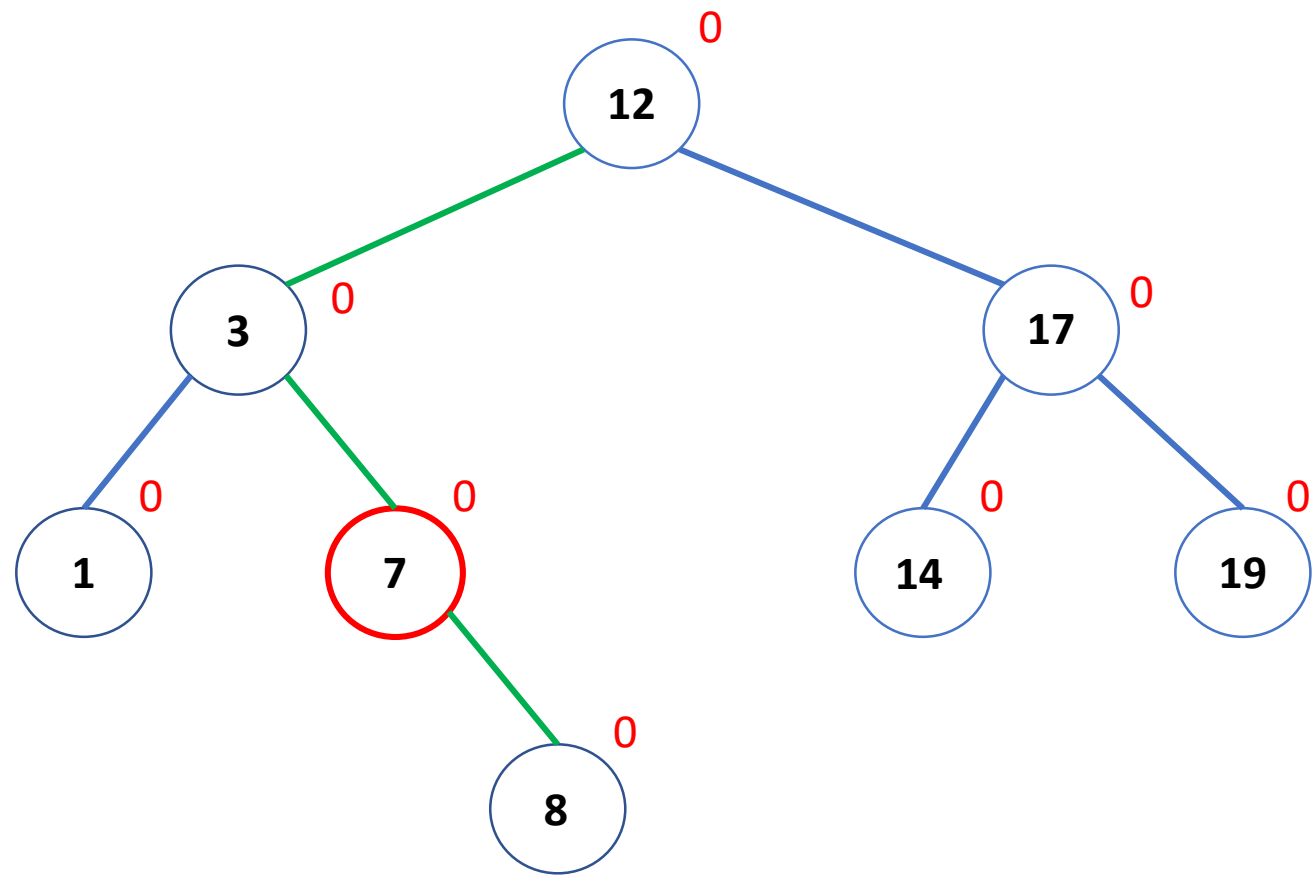
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



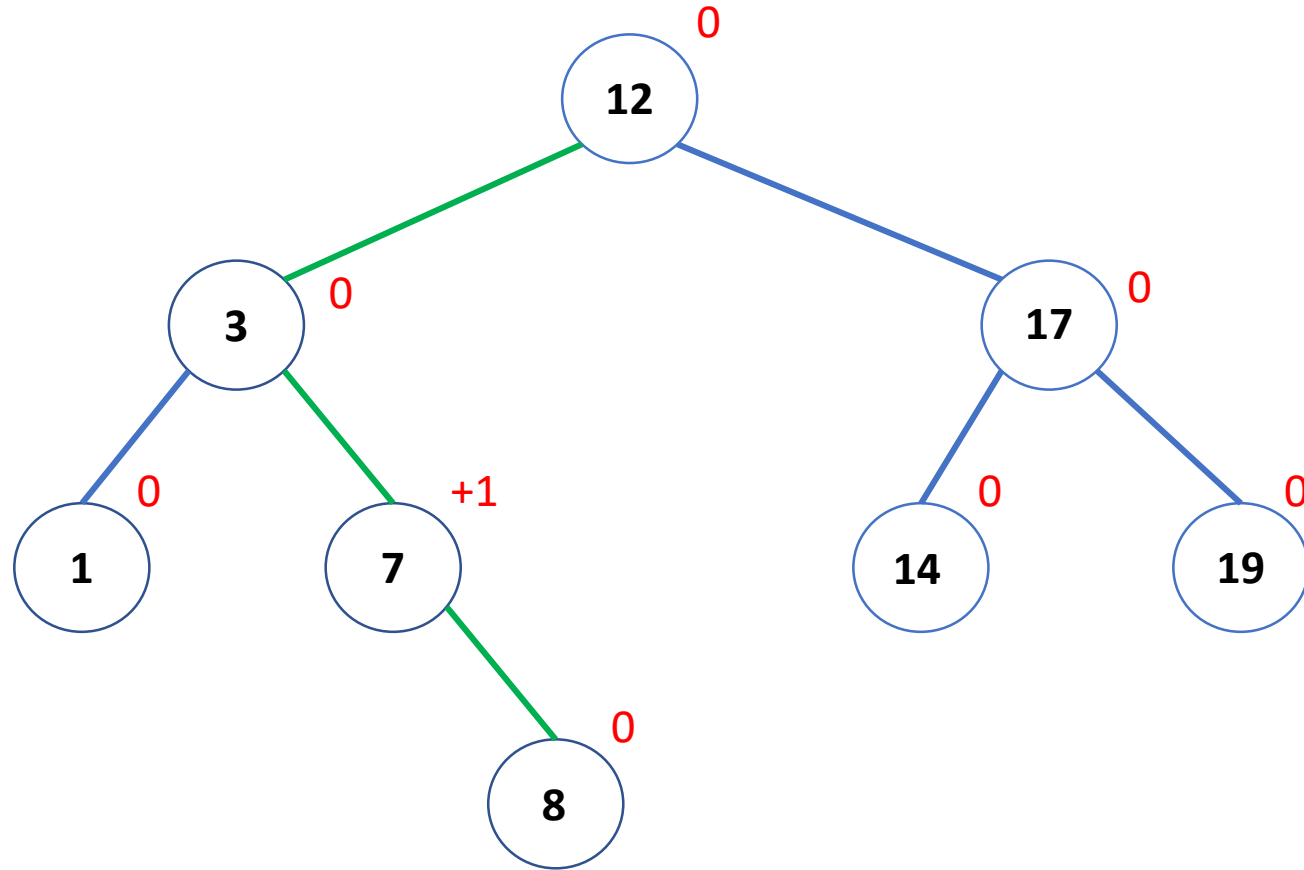
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



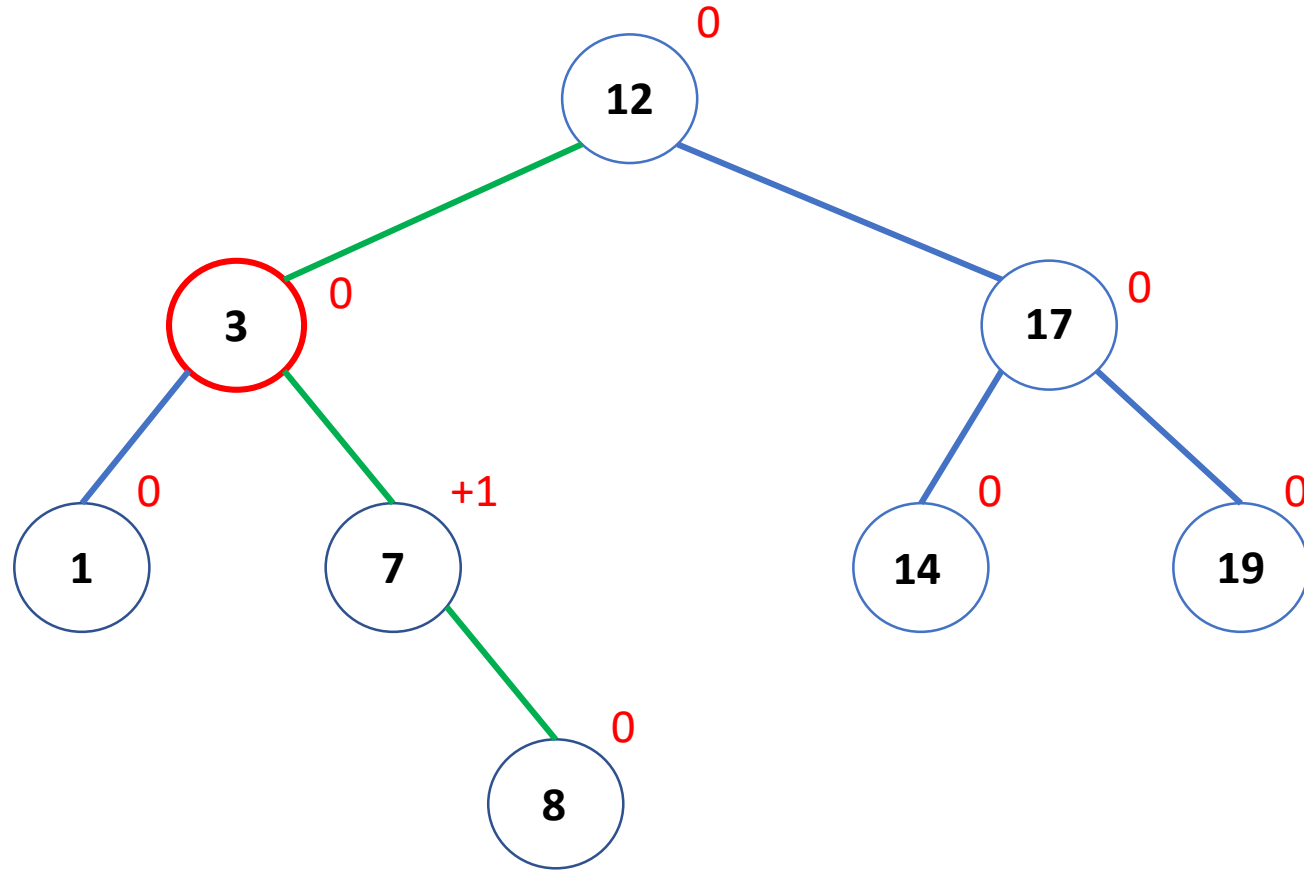
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



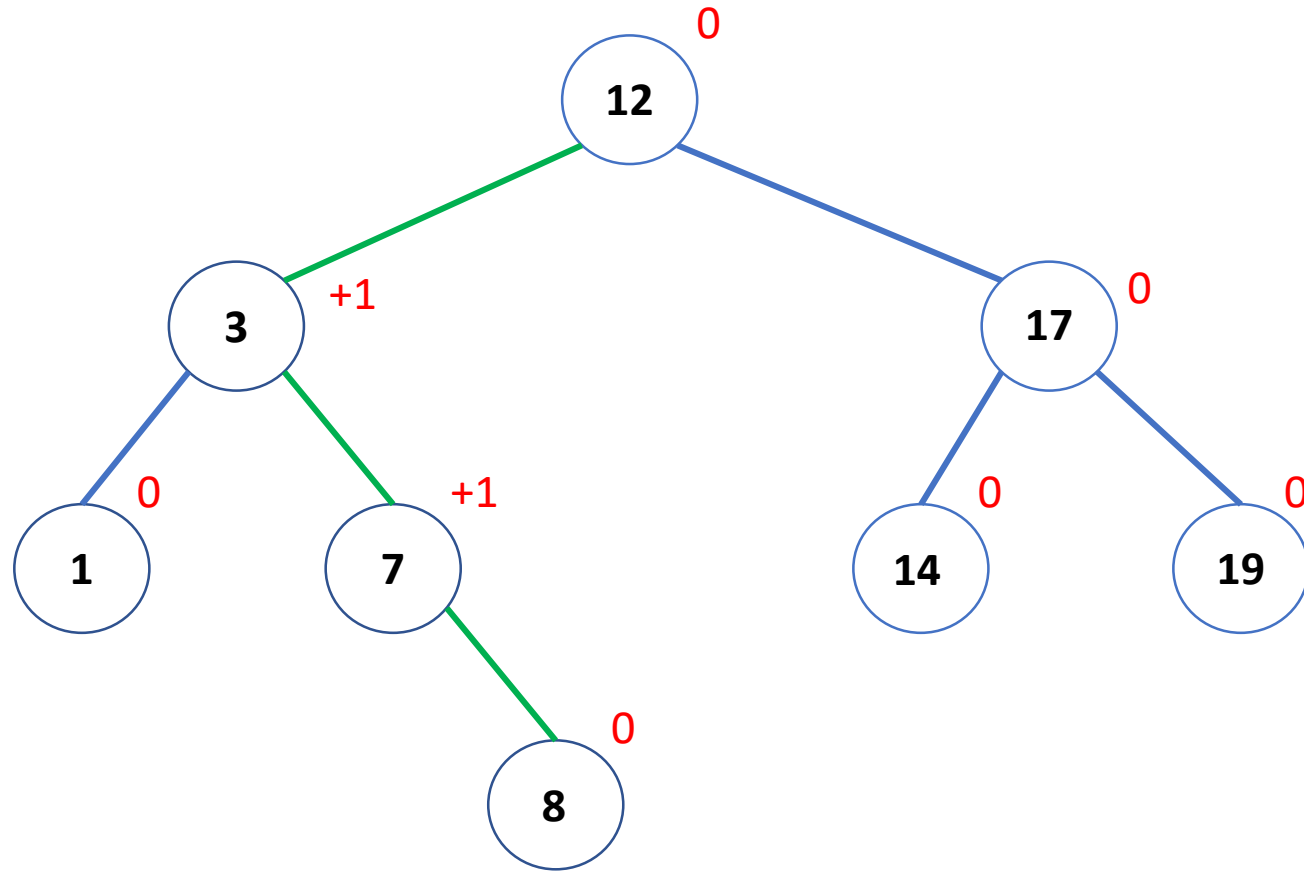
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



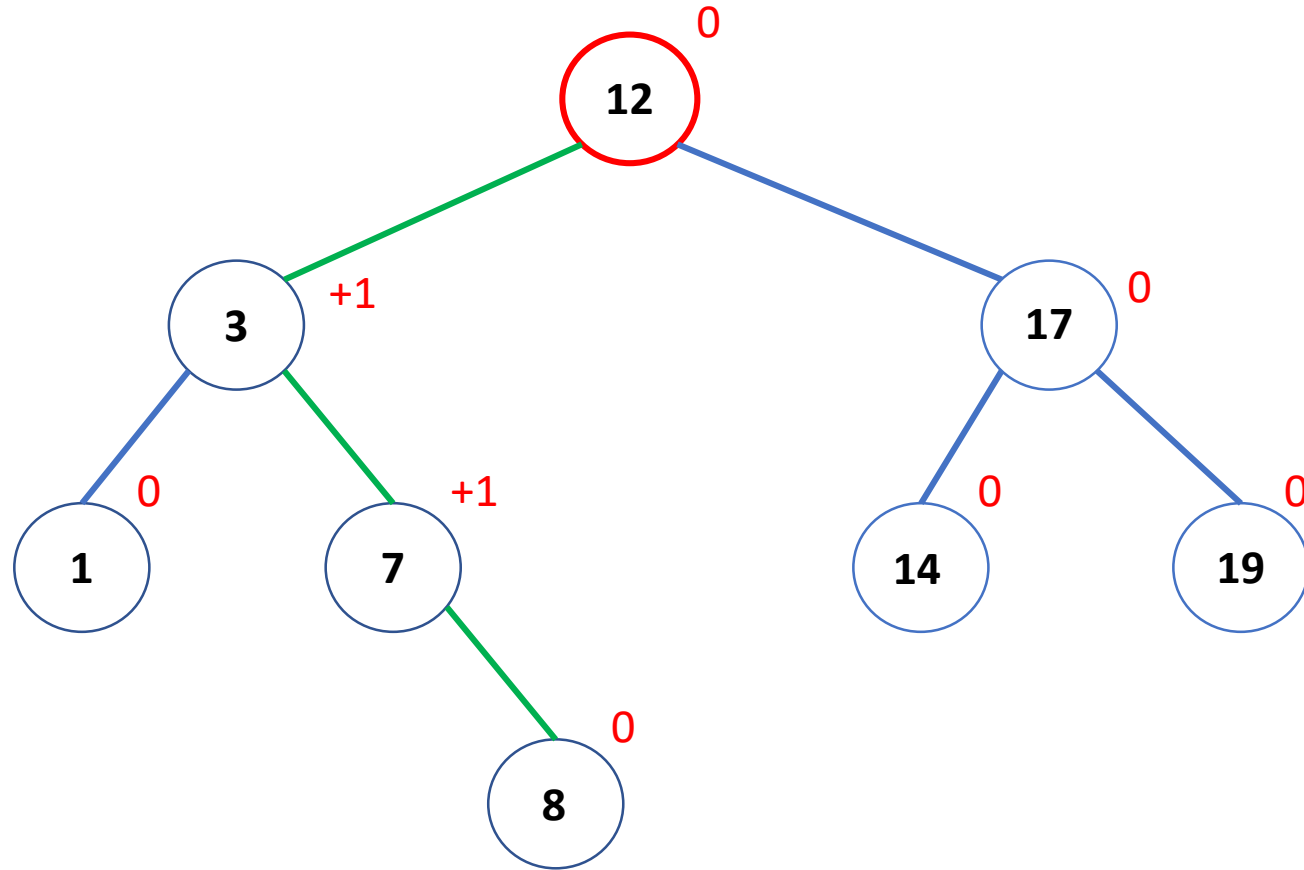
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



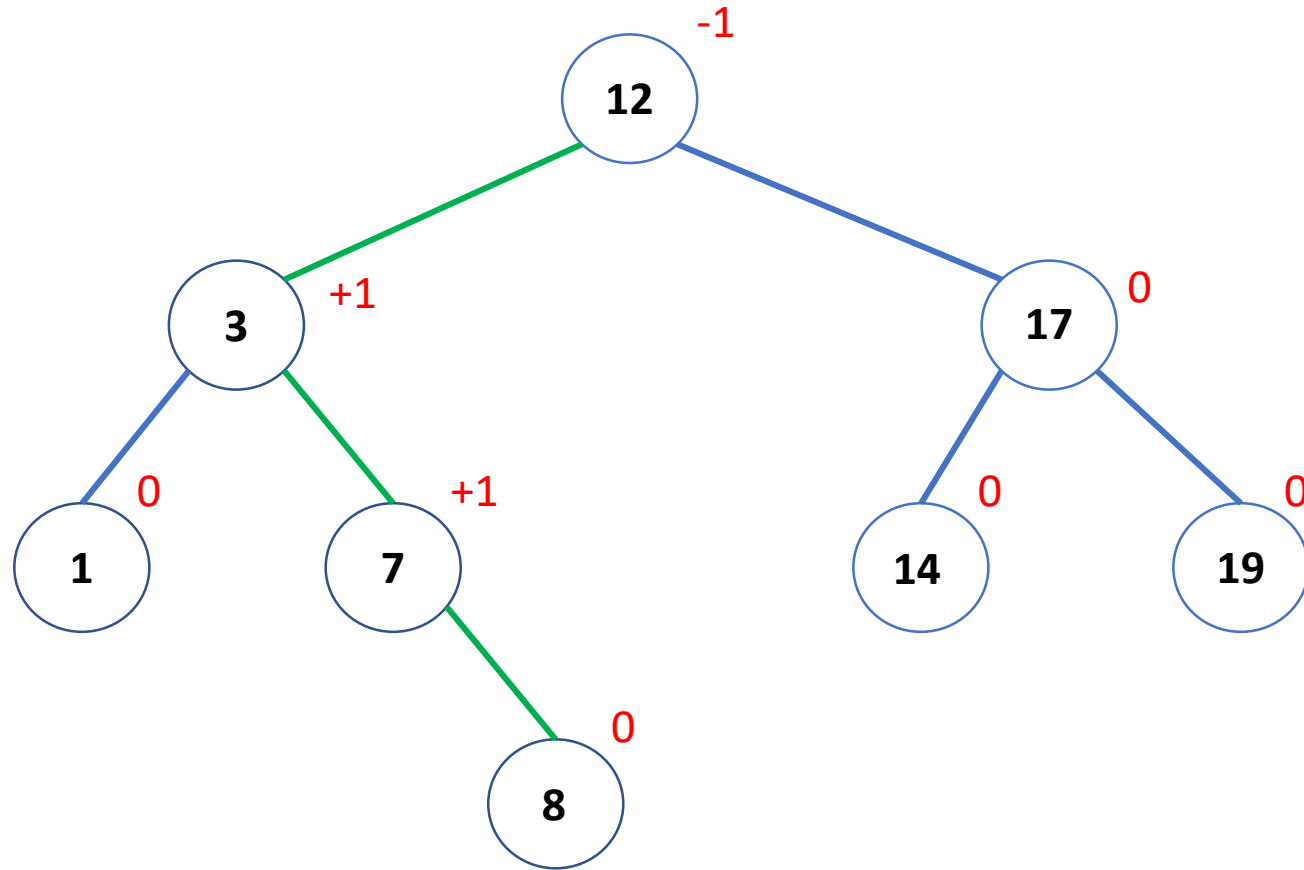
Example: AVL of {1, 3, 7, 12, 14, 17, 19}

Insert(T, 8)



Example: AVL of {1, 3, 7, 12, 14, 17, 19}

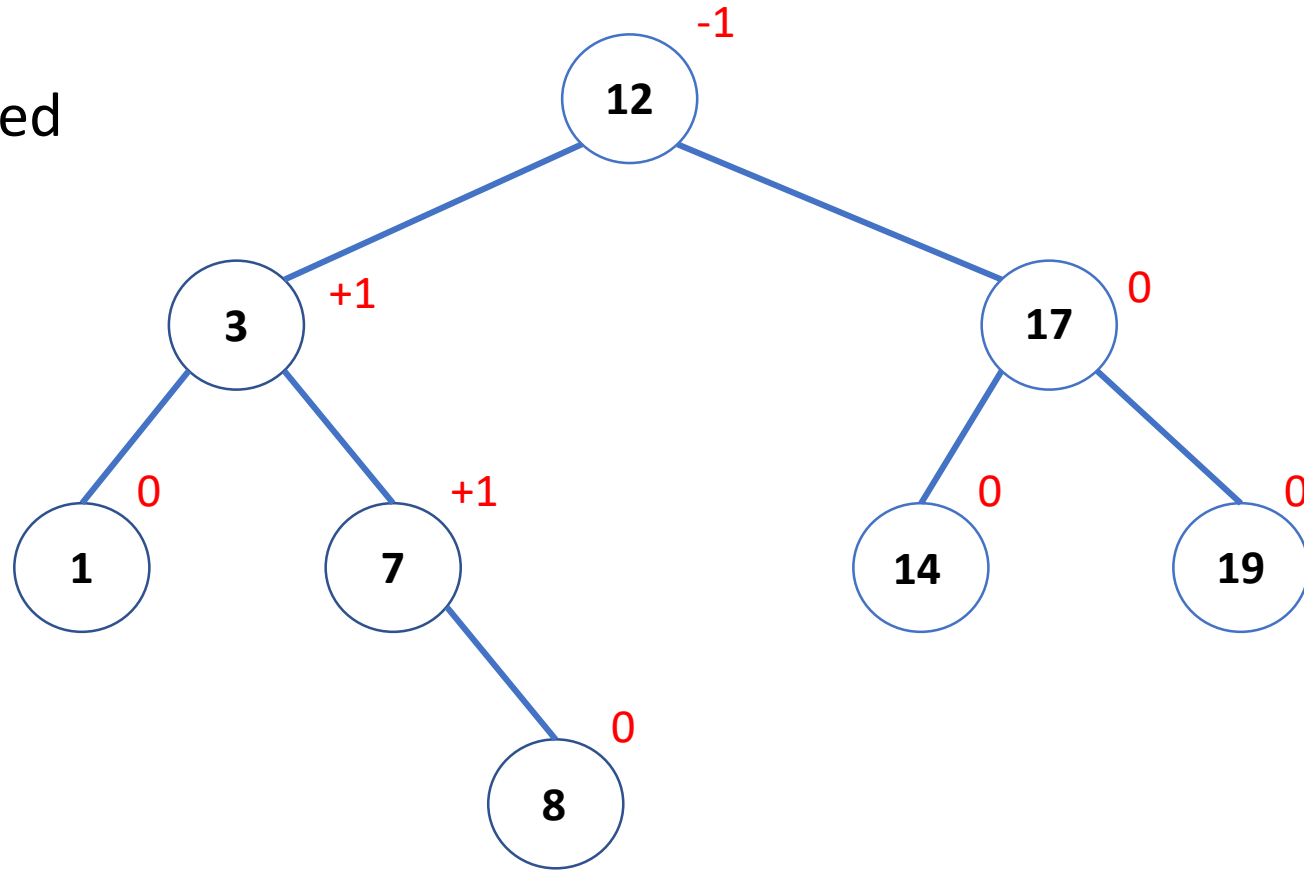
Insert(T, 8)



Example: AVL of {1, 3, 7, 12, 14, 17, 19}

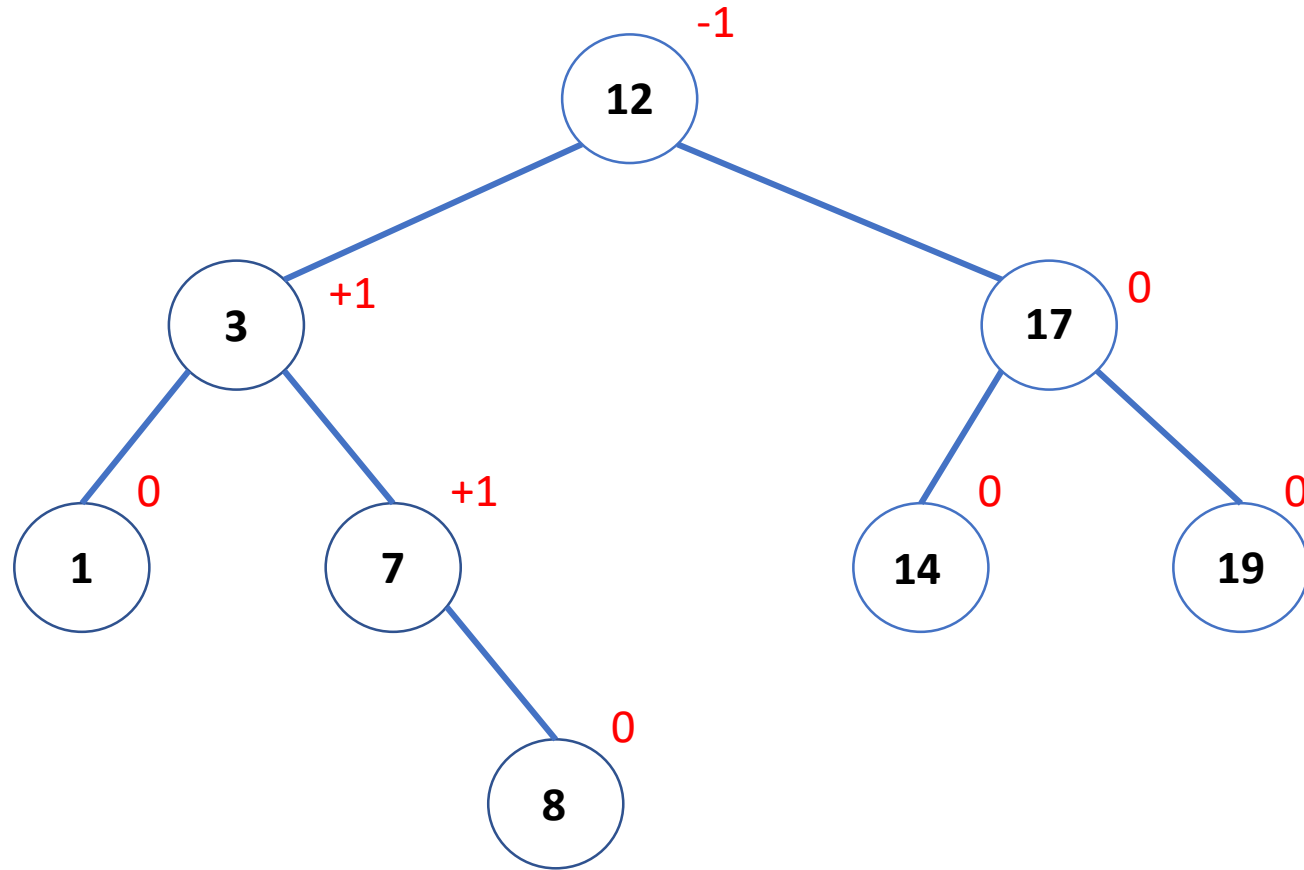
Insert(T, 8) :

No rebalancing needed



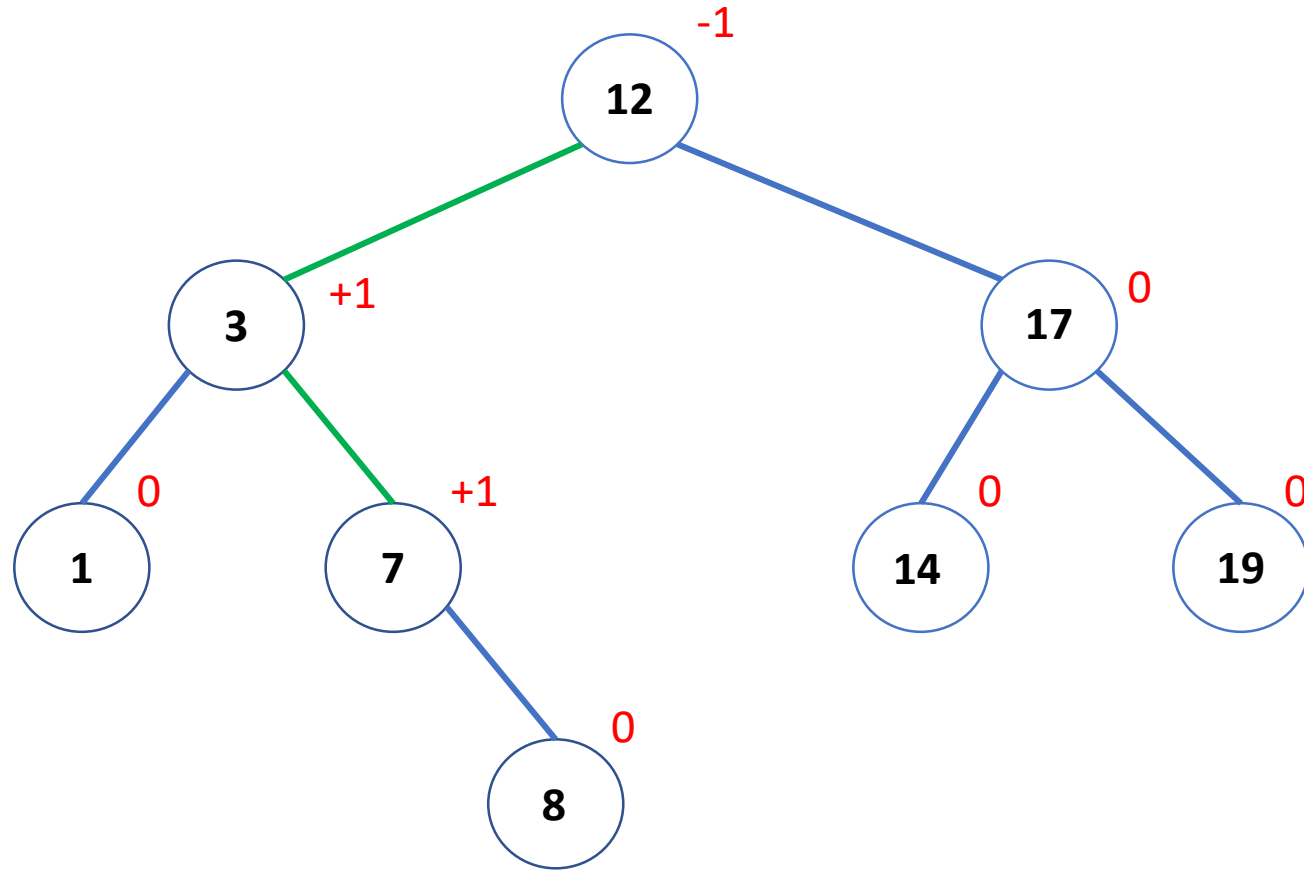
Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5)



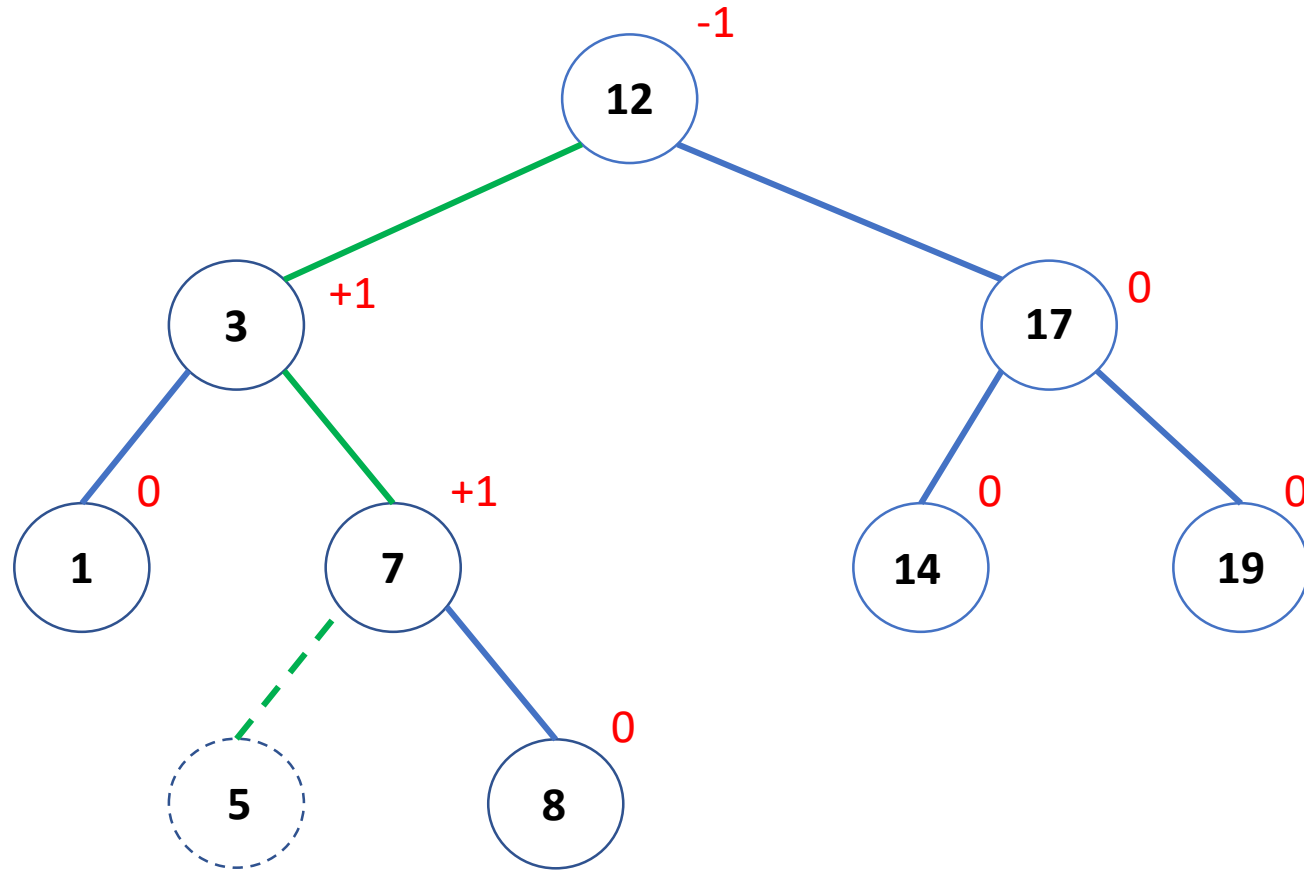
Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5)



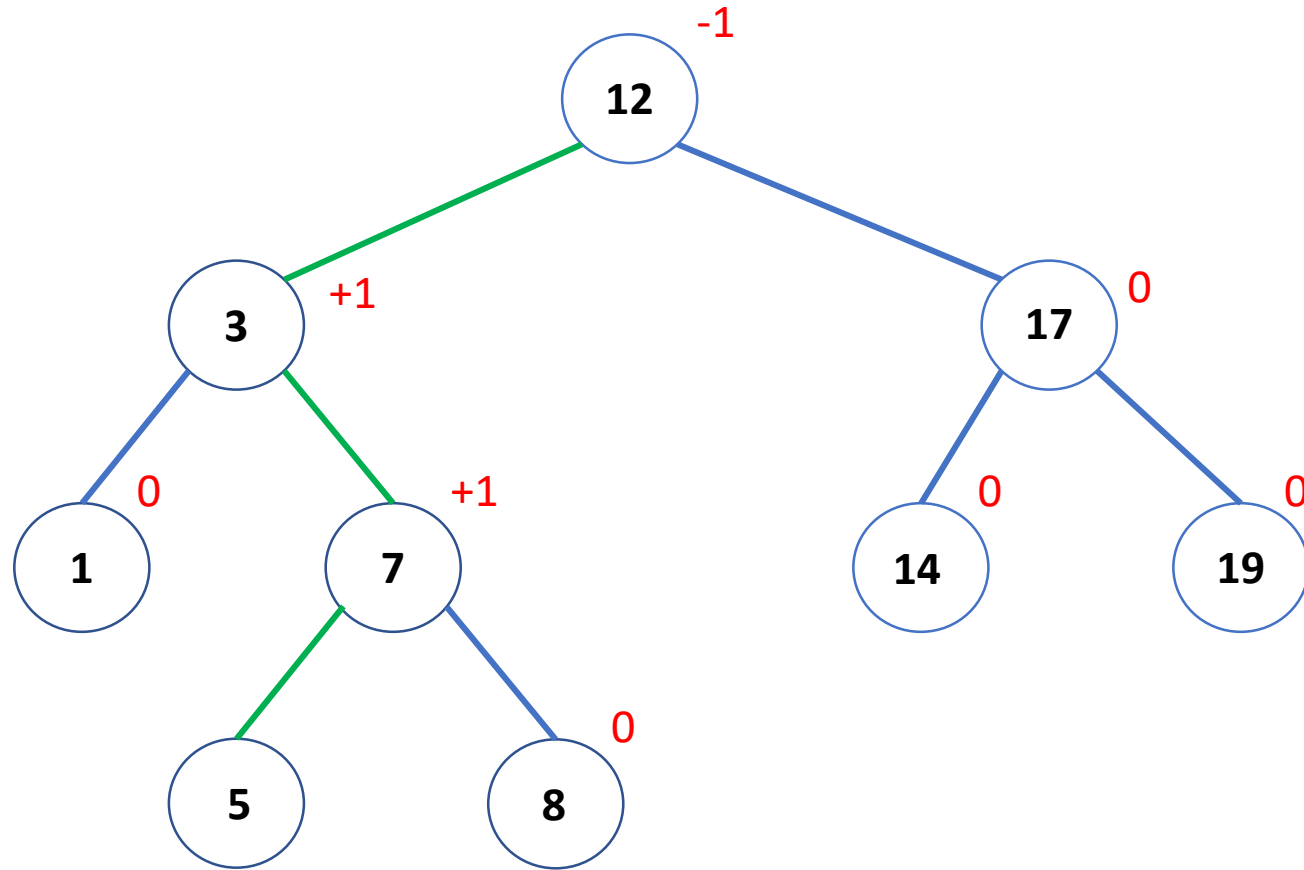
Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5)



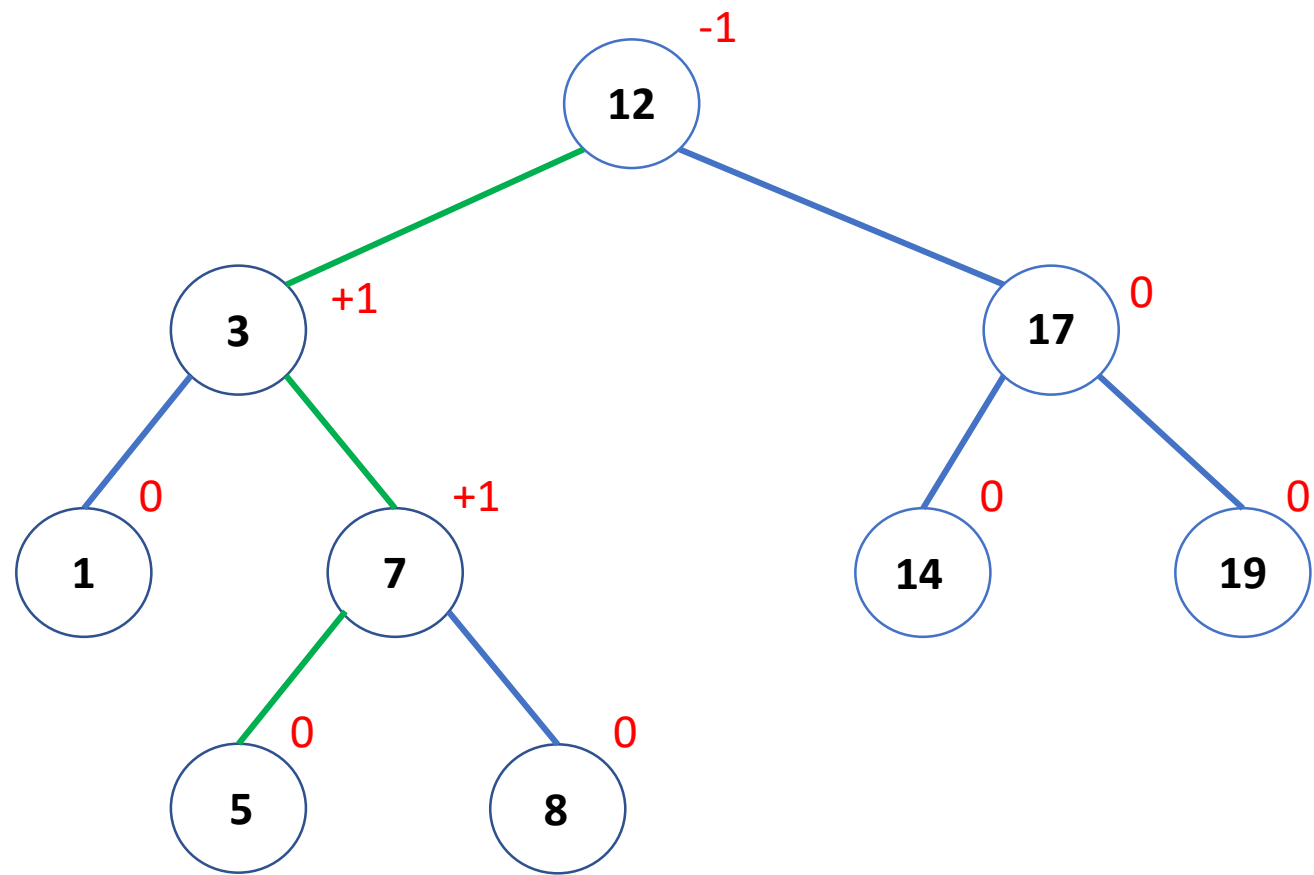
Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5)



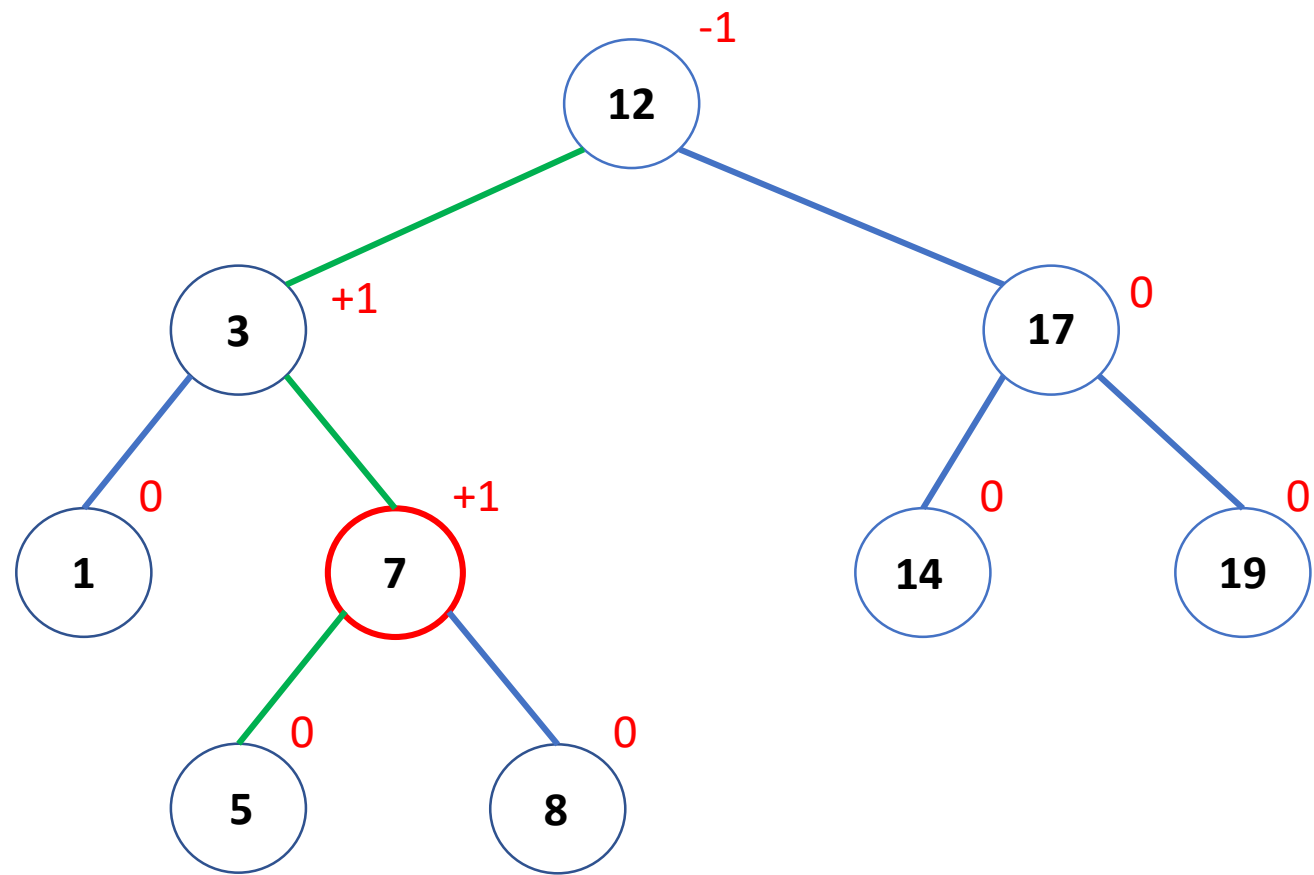
Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5)



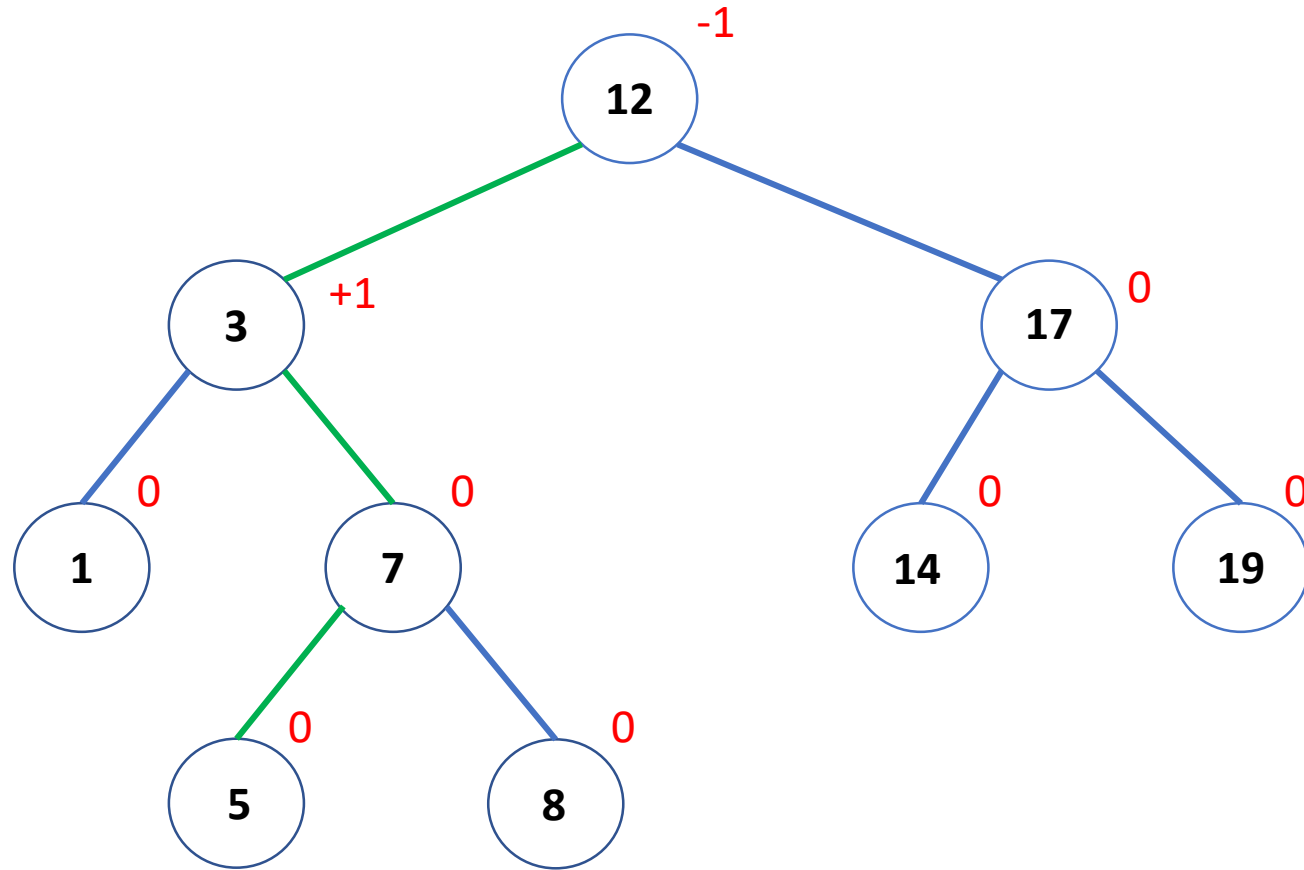
Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5)



Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

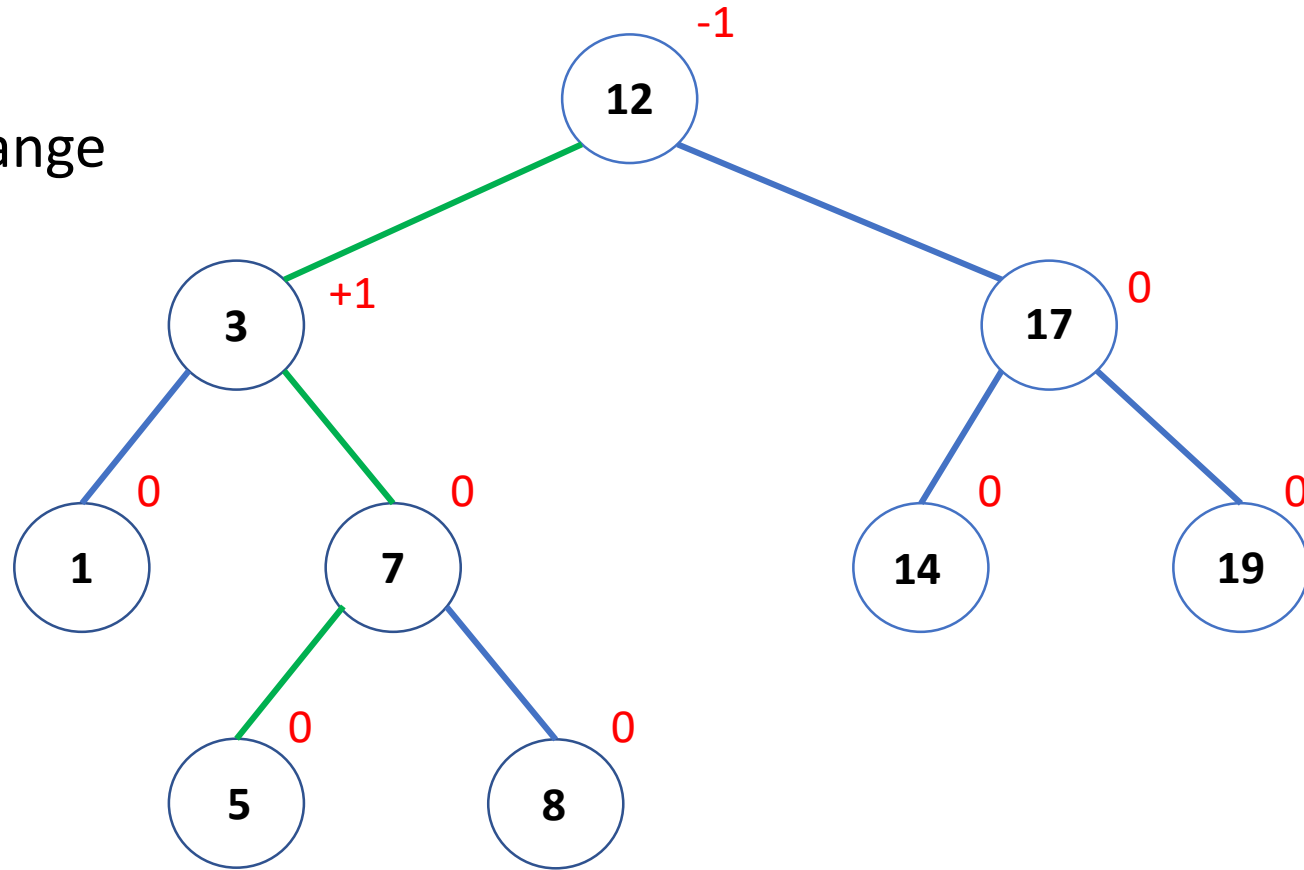
Insert(T, 5)



Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5):

height(7) doesn't change

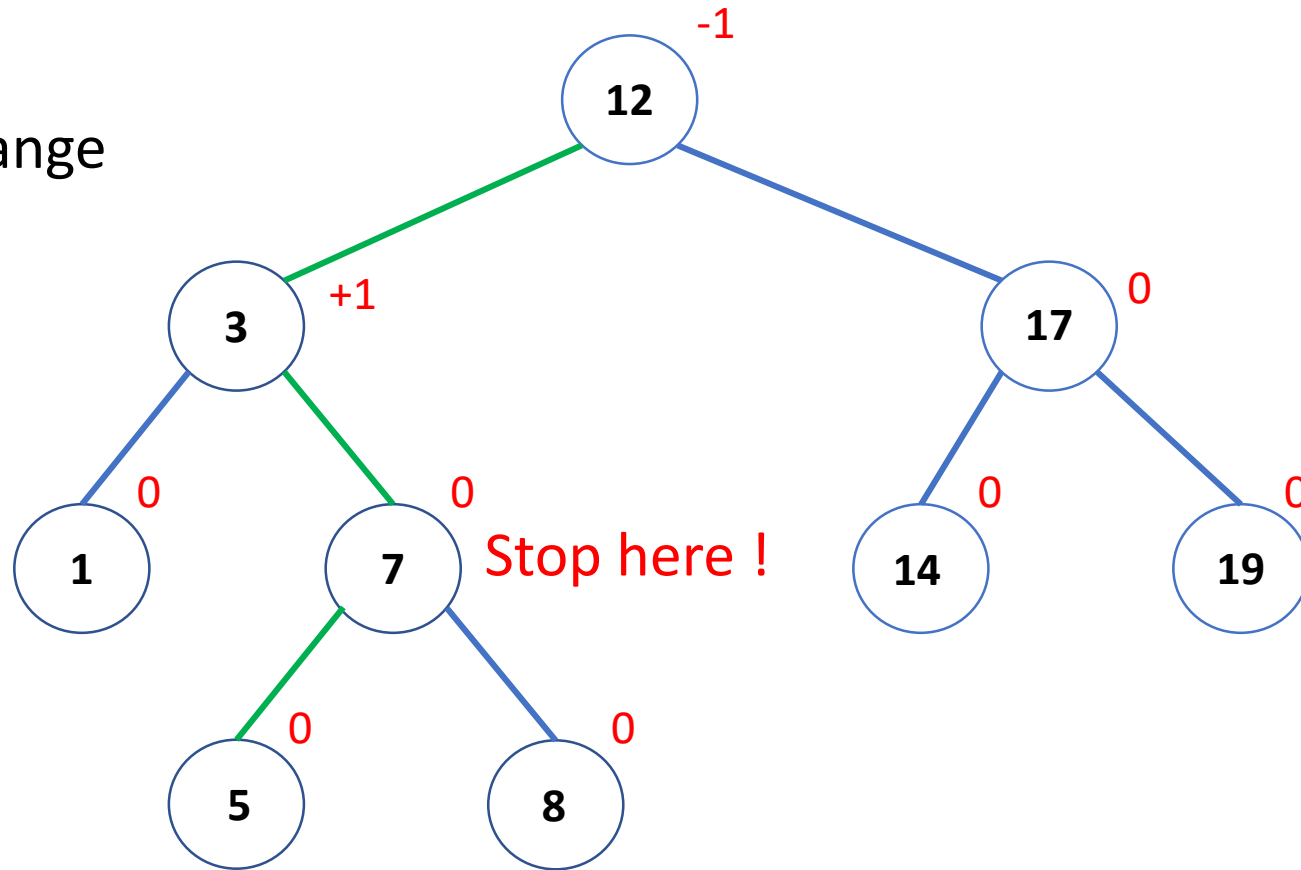


Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5):

height(7) doesn't change

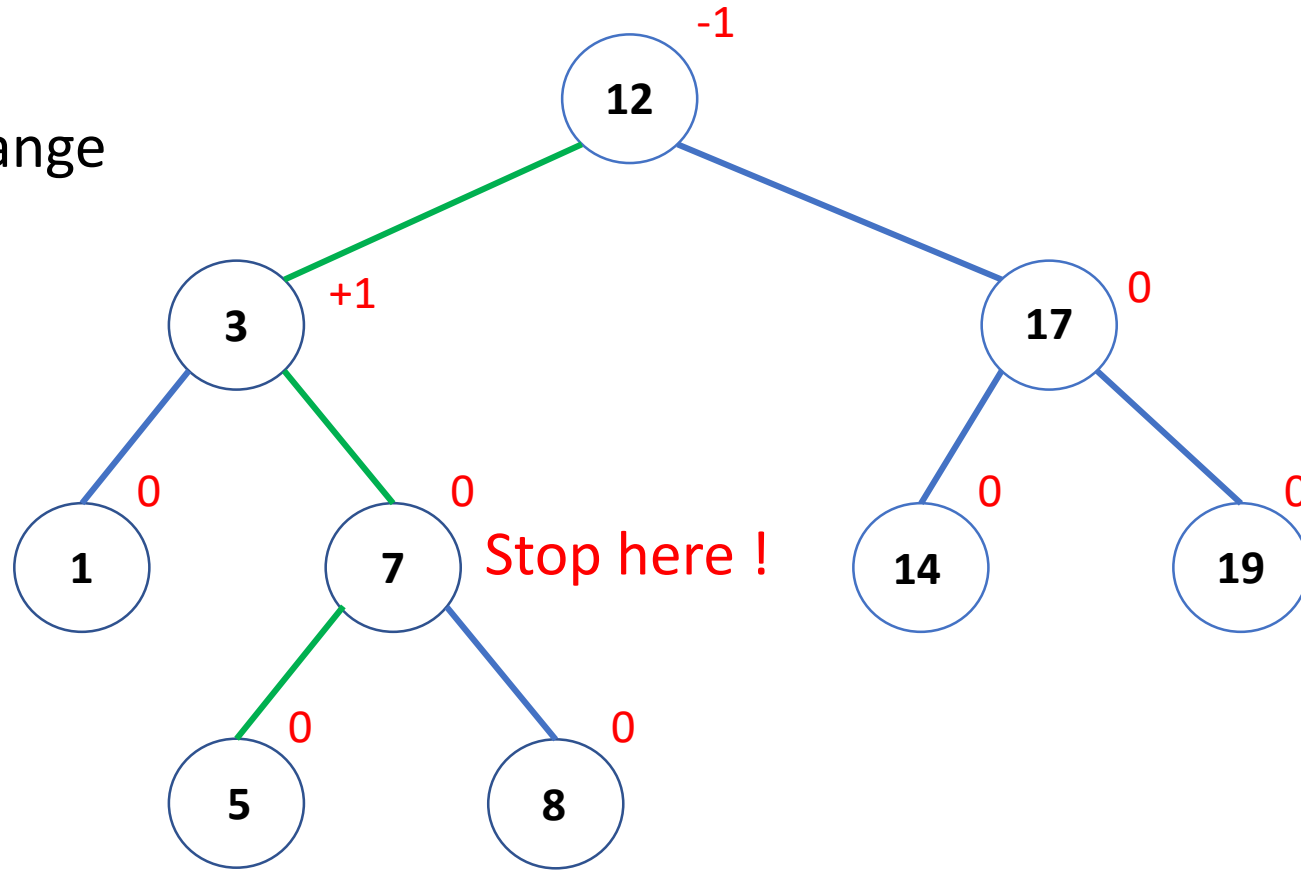
⇒ Stop at 7 !



Example: AVL of {1, 3, 7, 8, 12, 14, 17, 19}

Insert(T, 5):

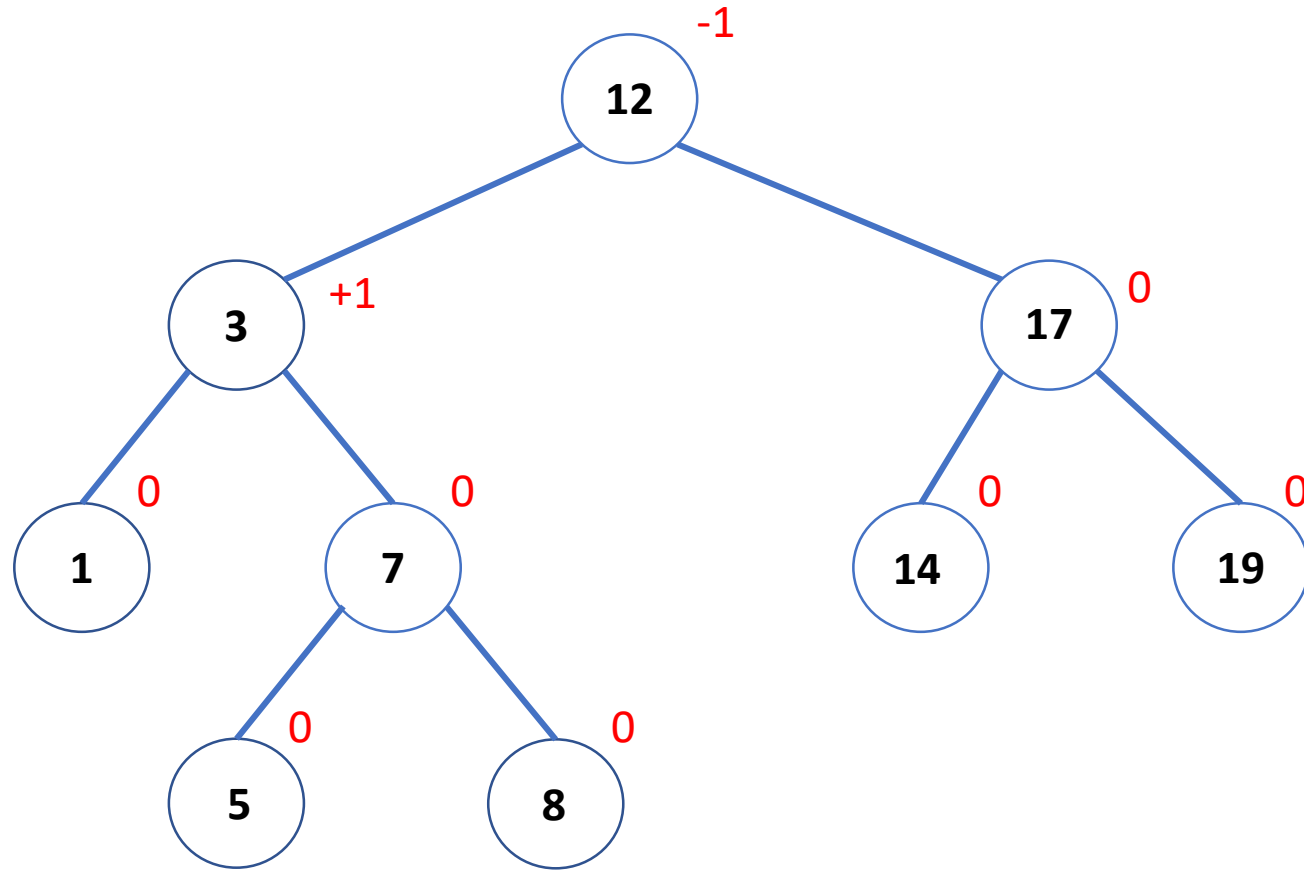
height(7) doesn't change
⇒ Stop at 7 !



No rebalancing needed !

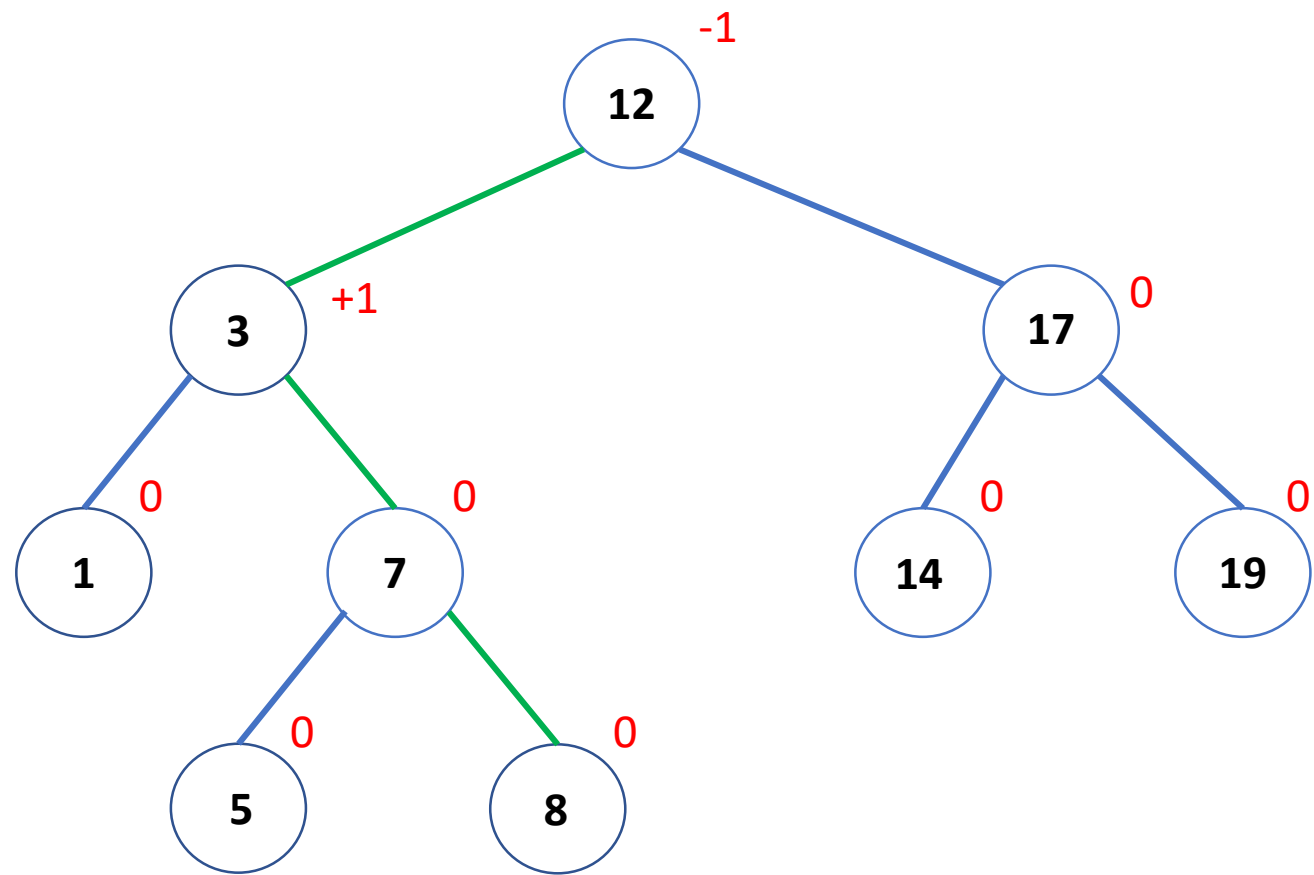
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



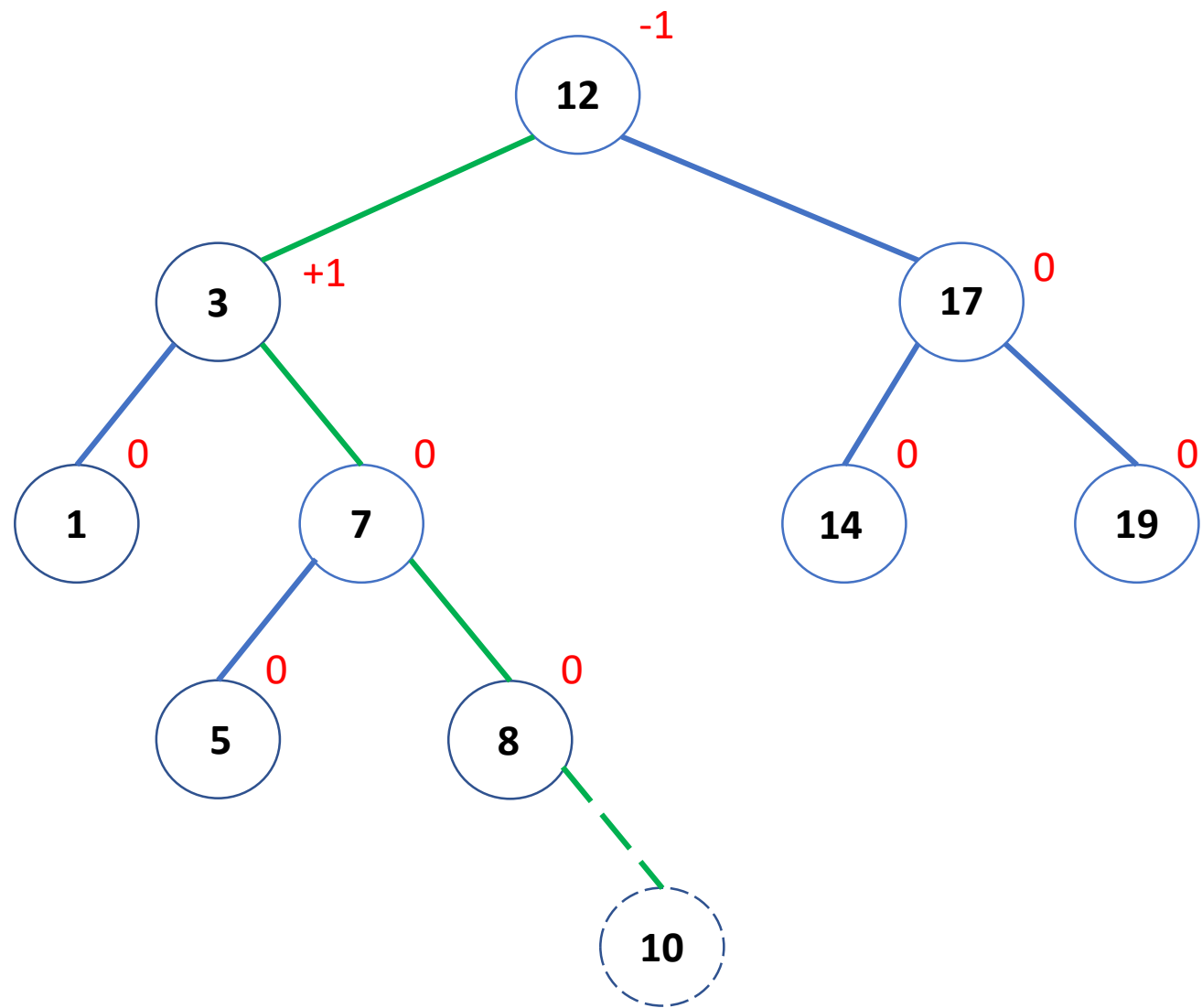
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



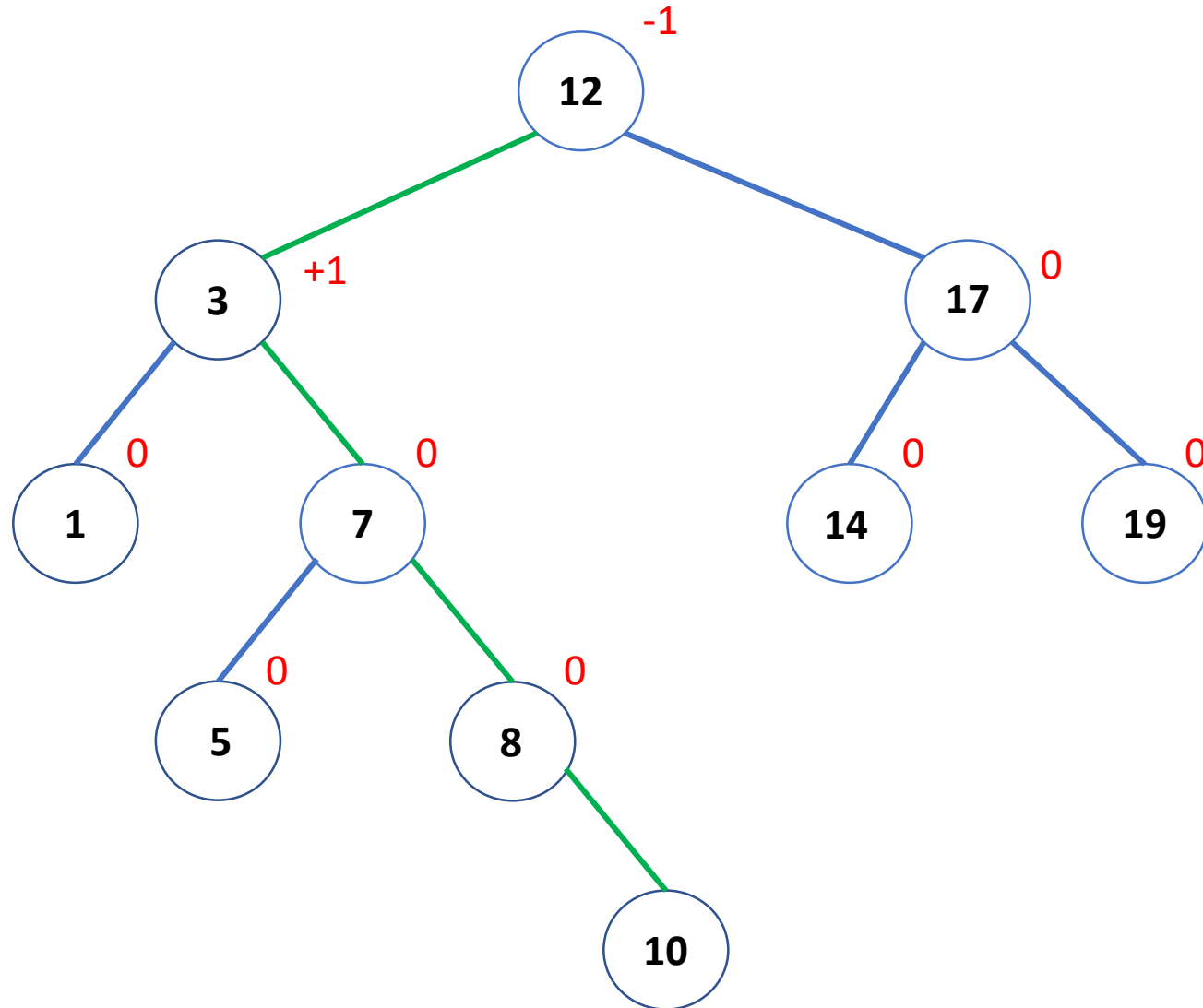
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



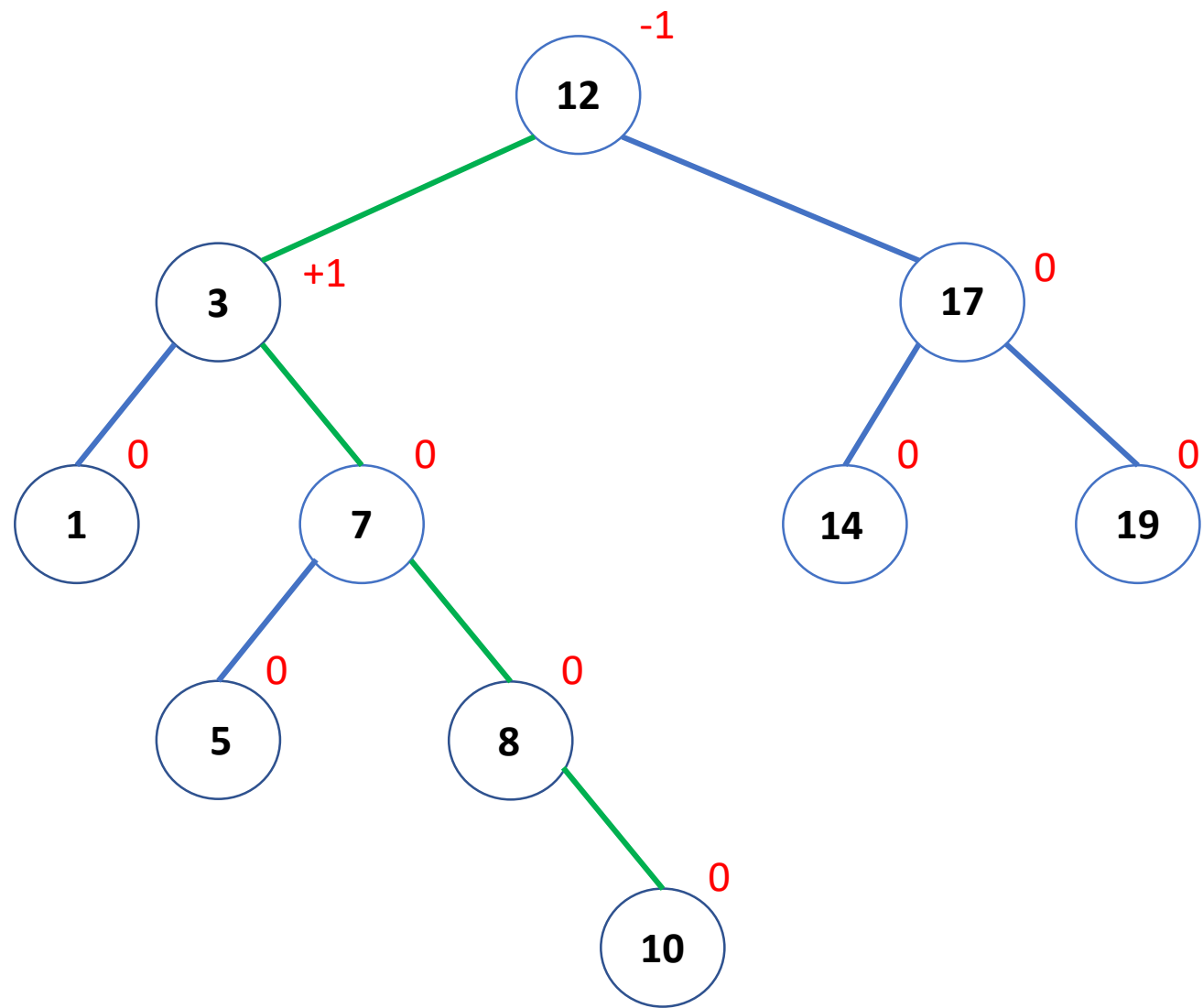
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



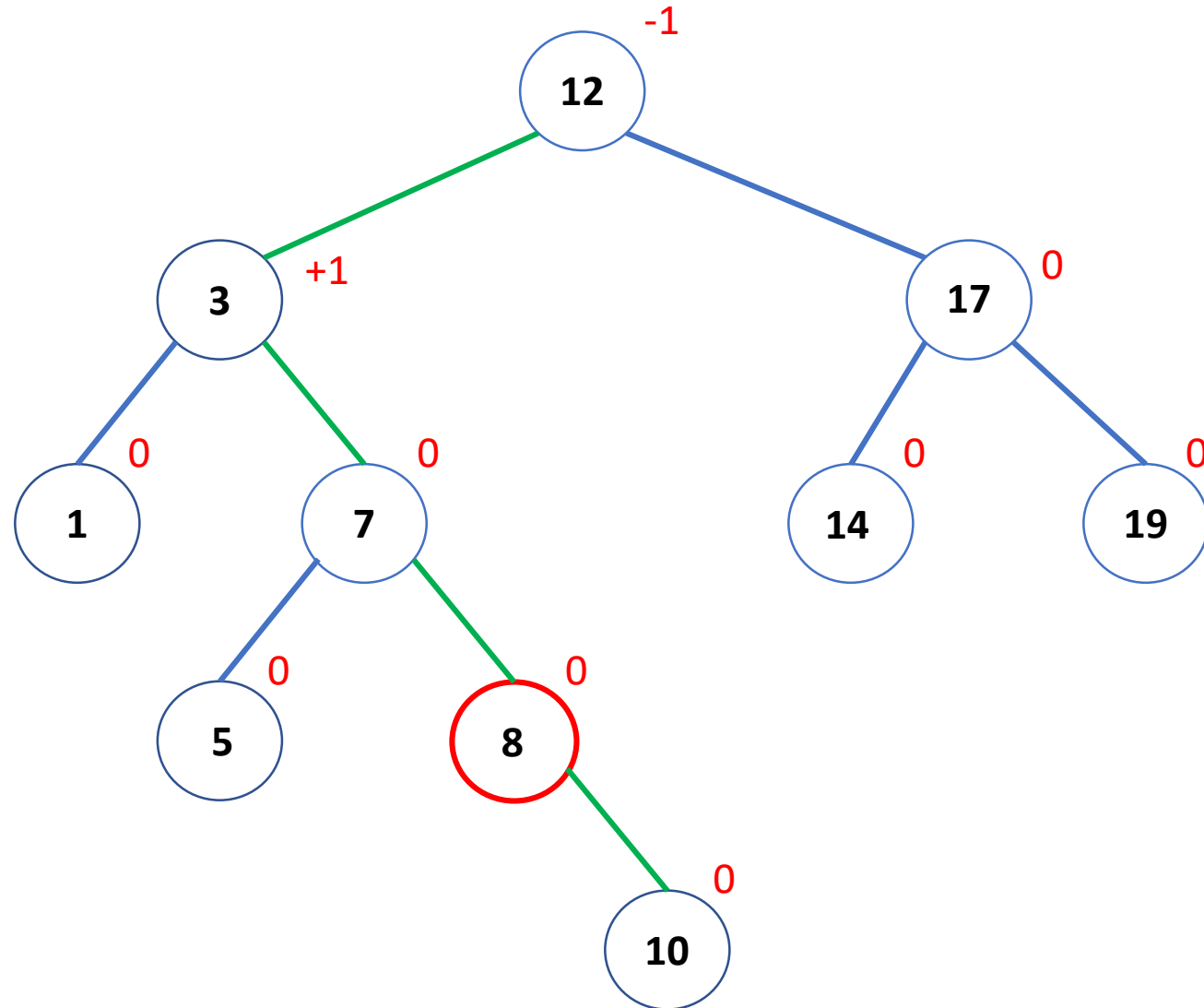
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



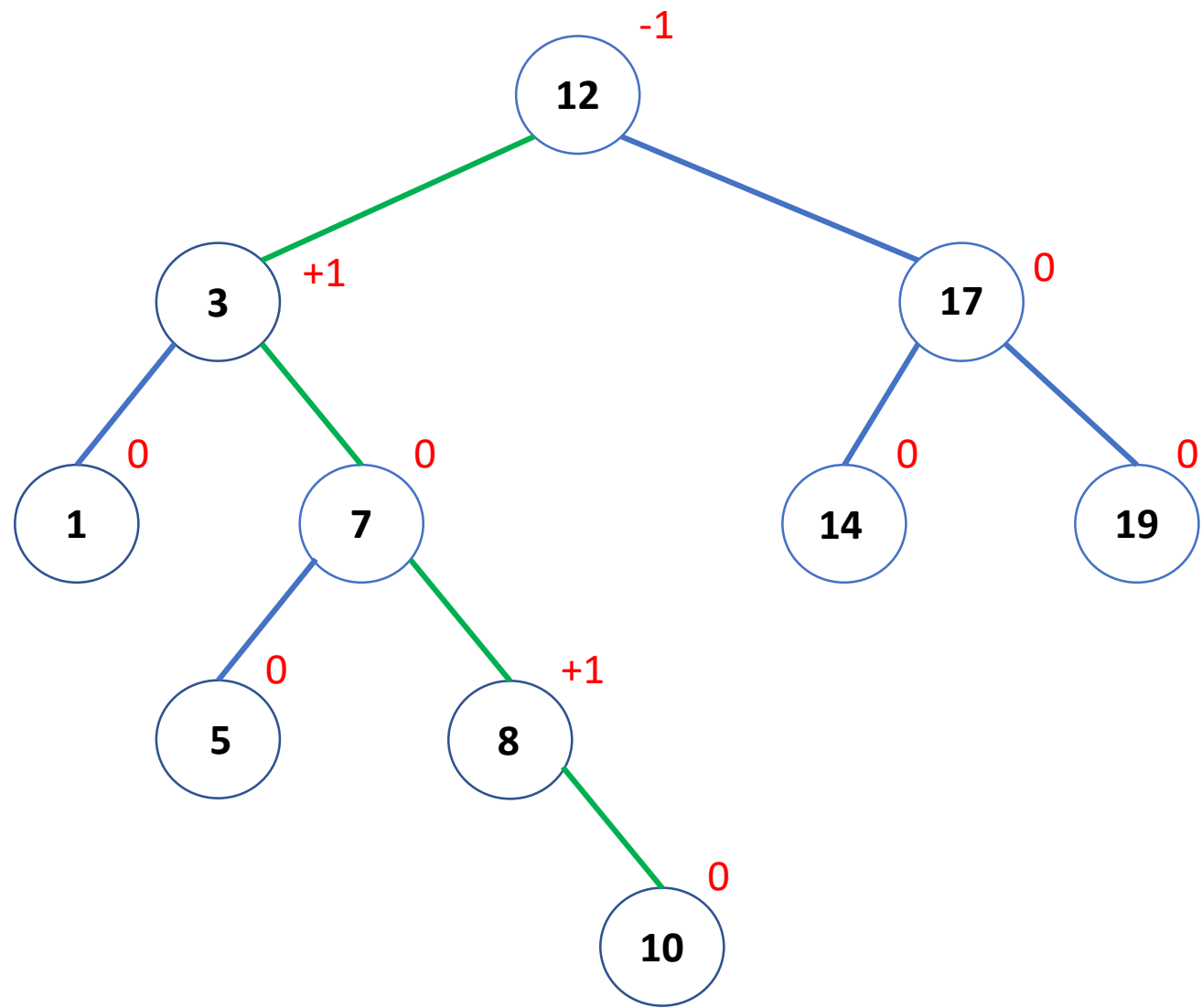
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



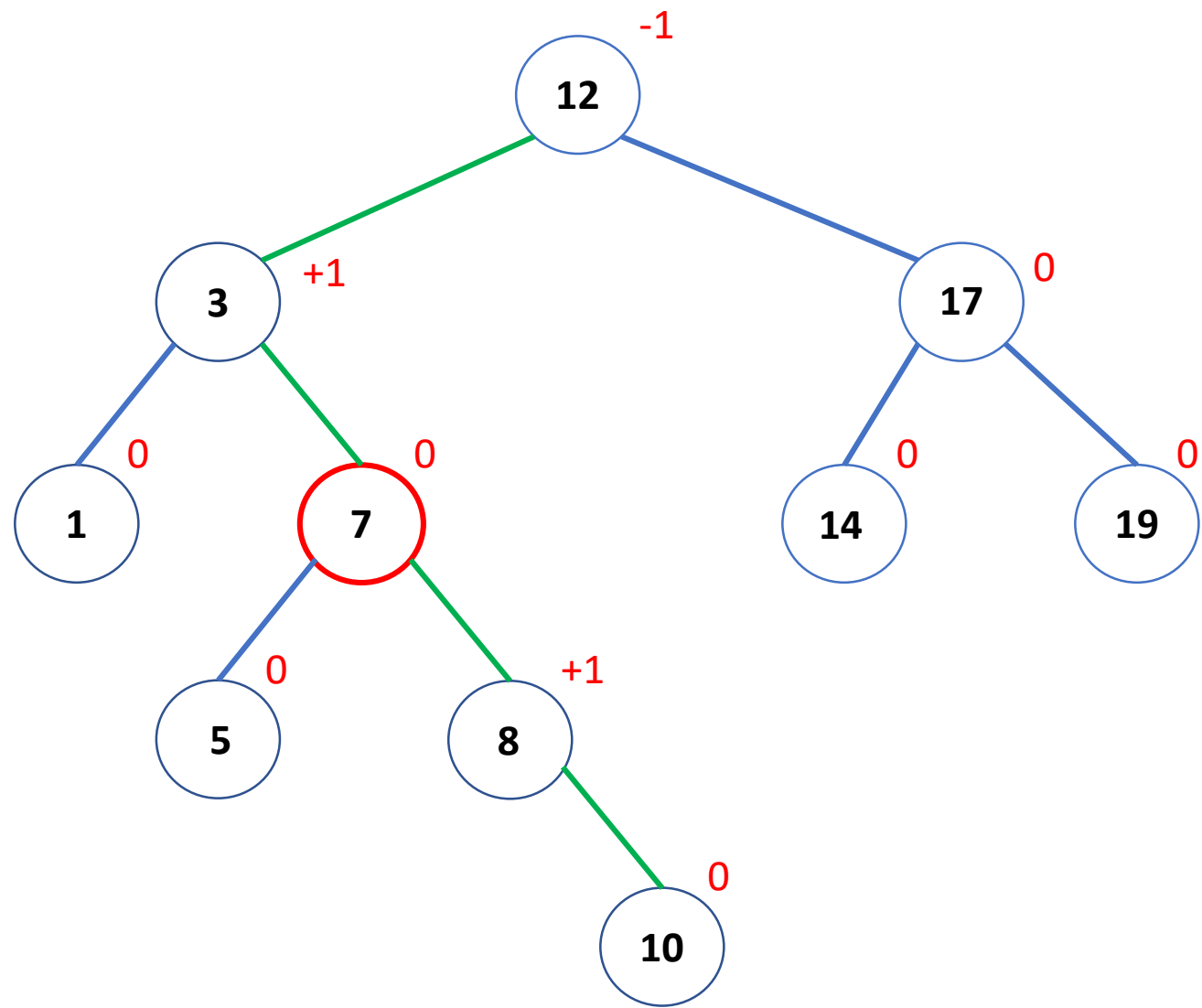
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



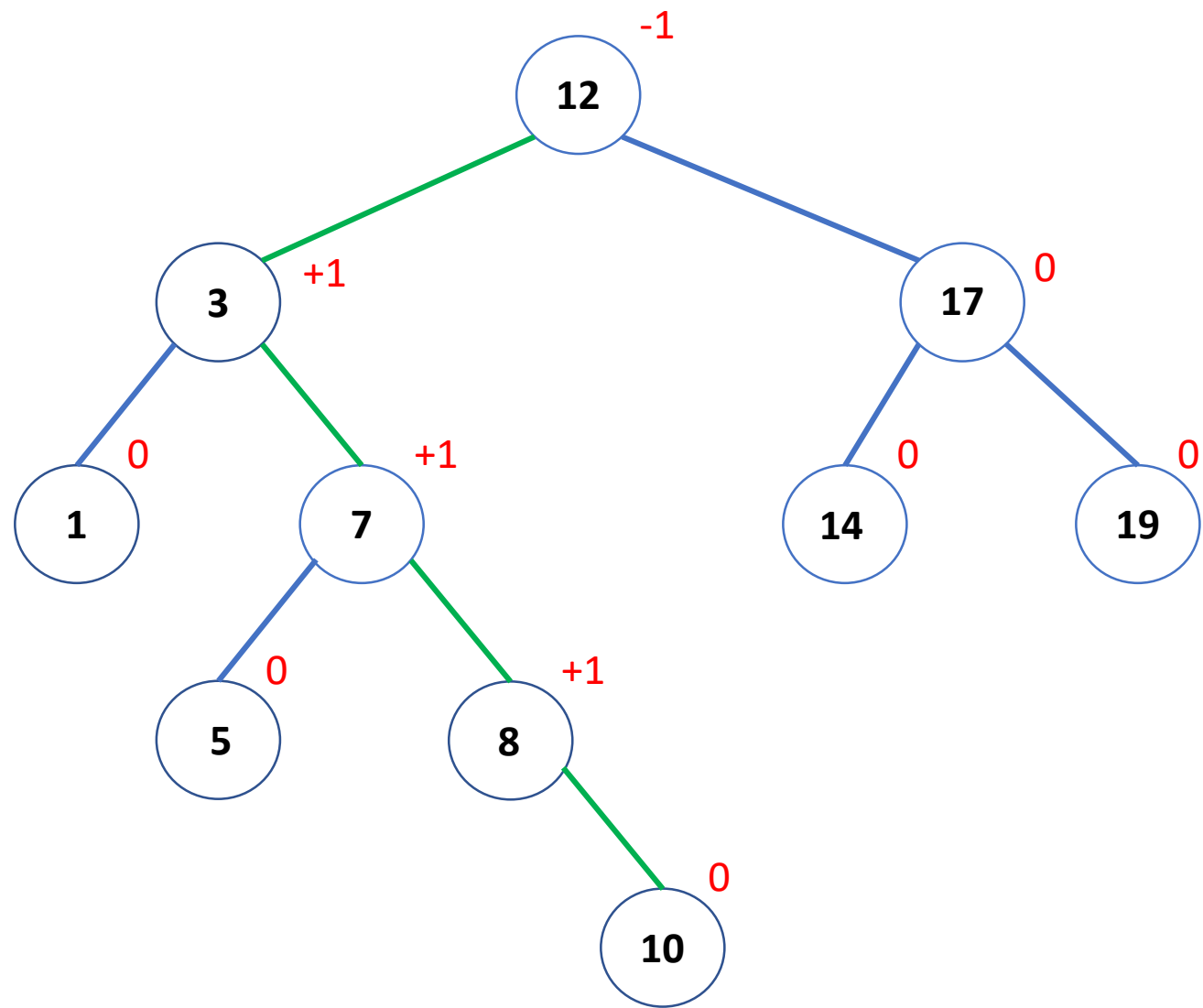
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



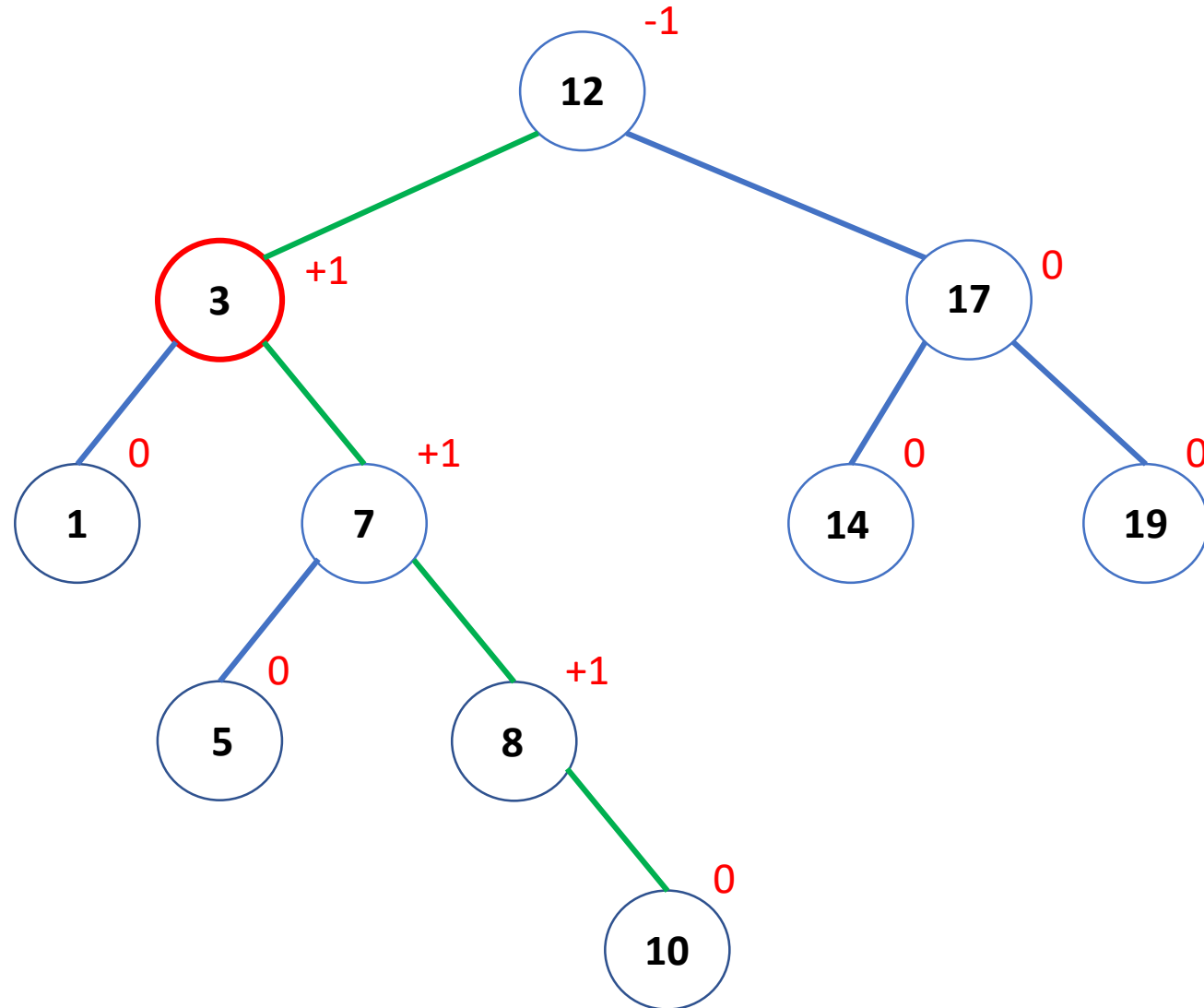
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



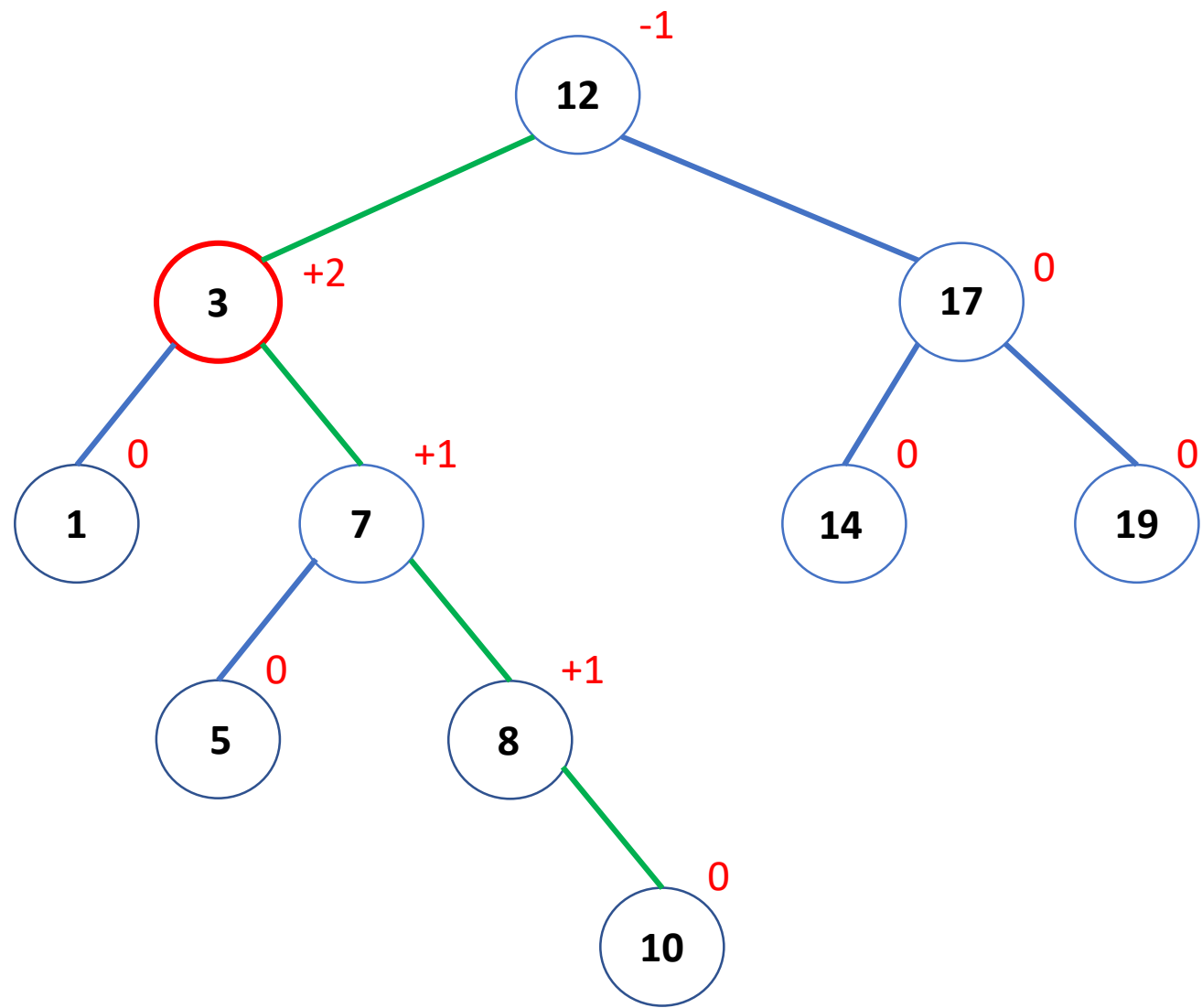
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)



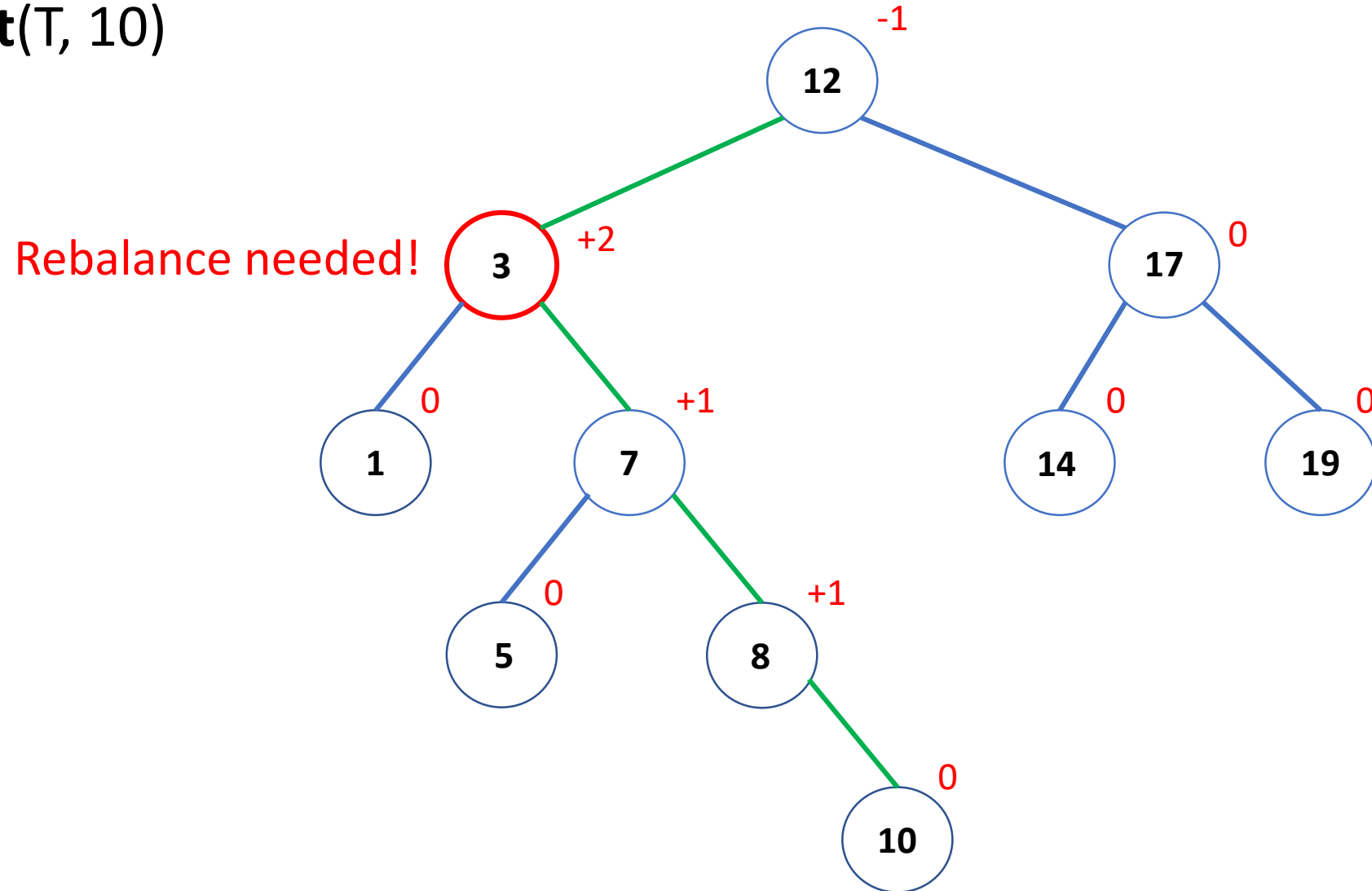
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 10)

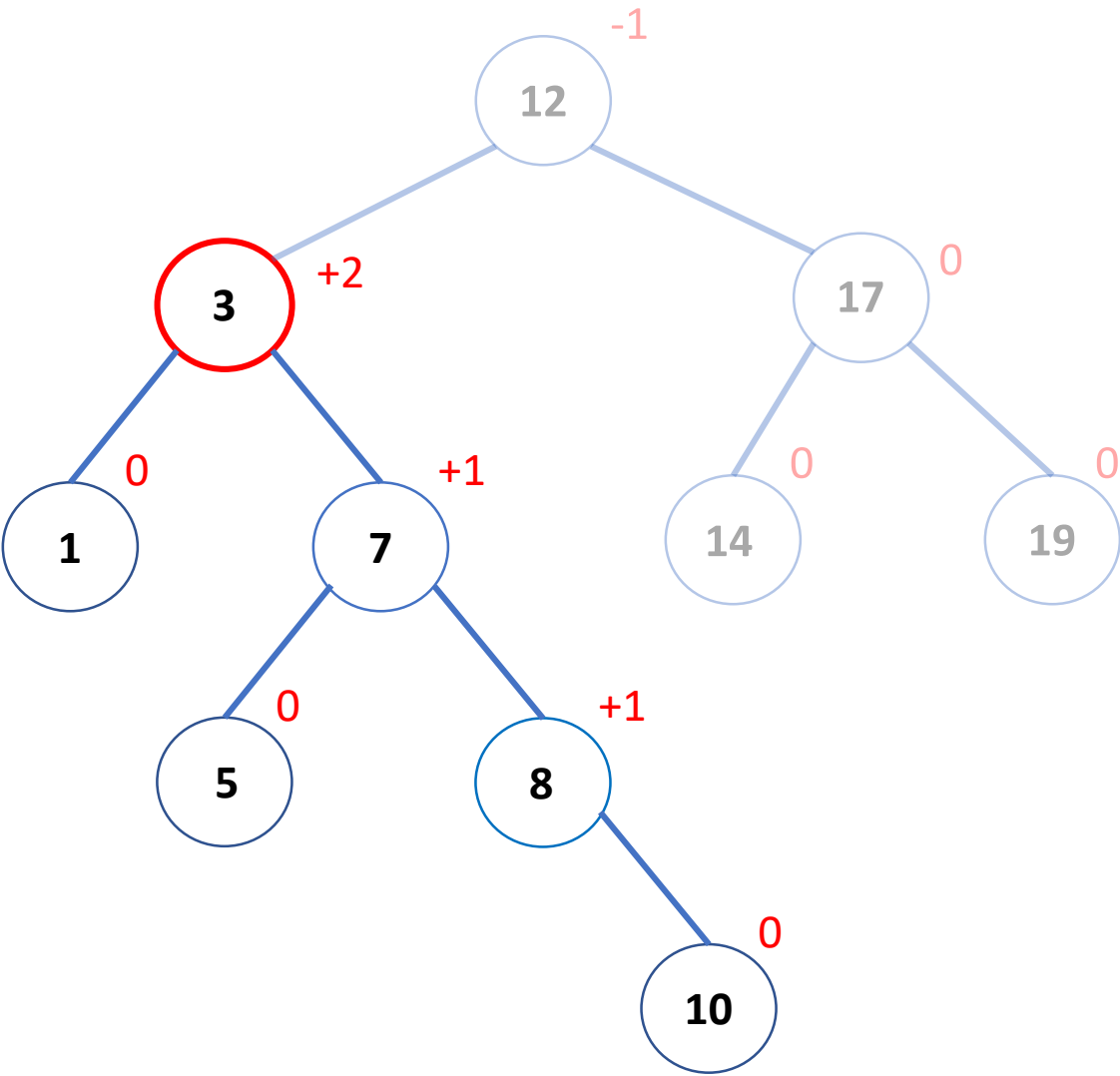


Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

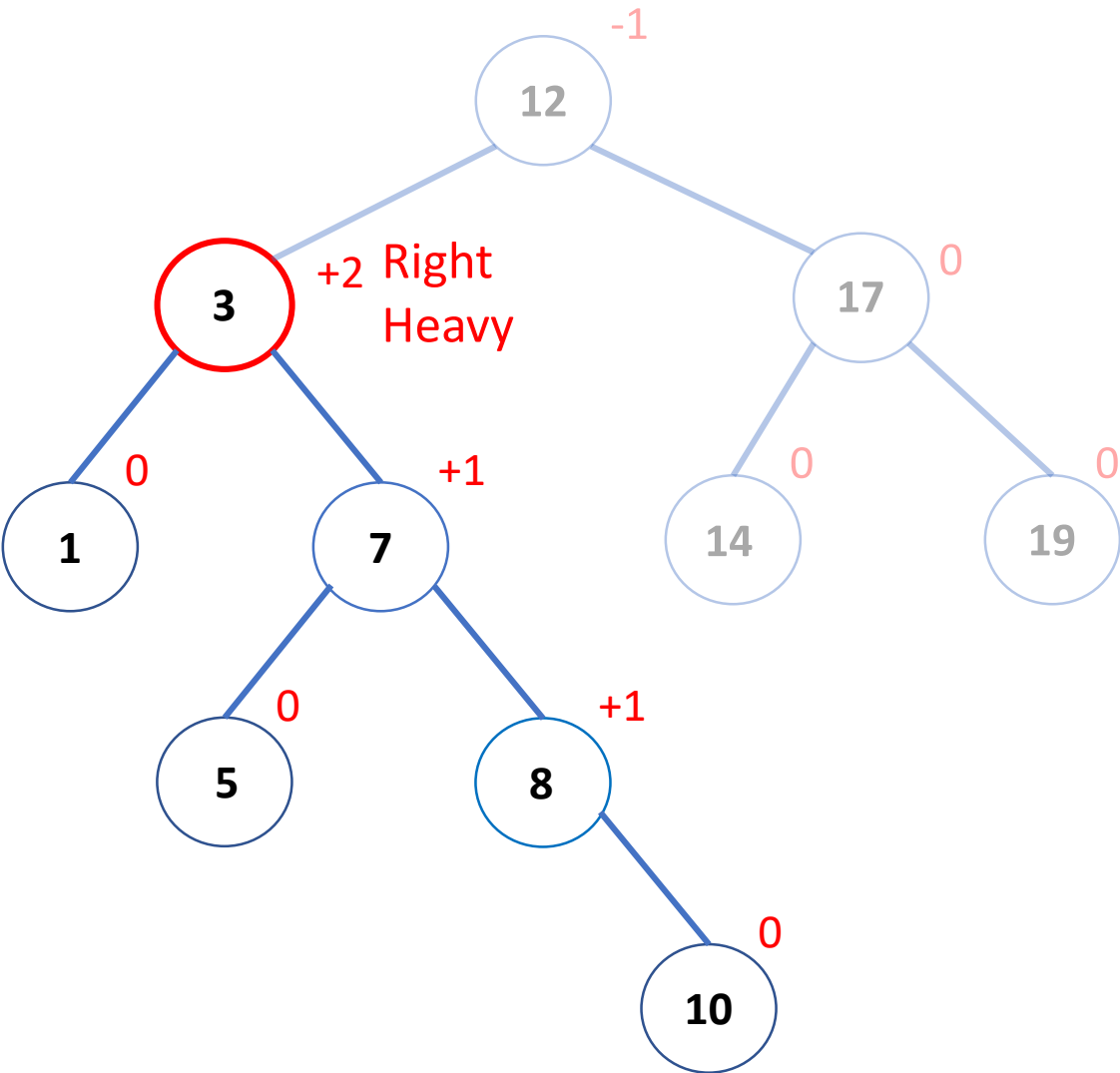
Insert(T, 10)



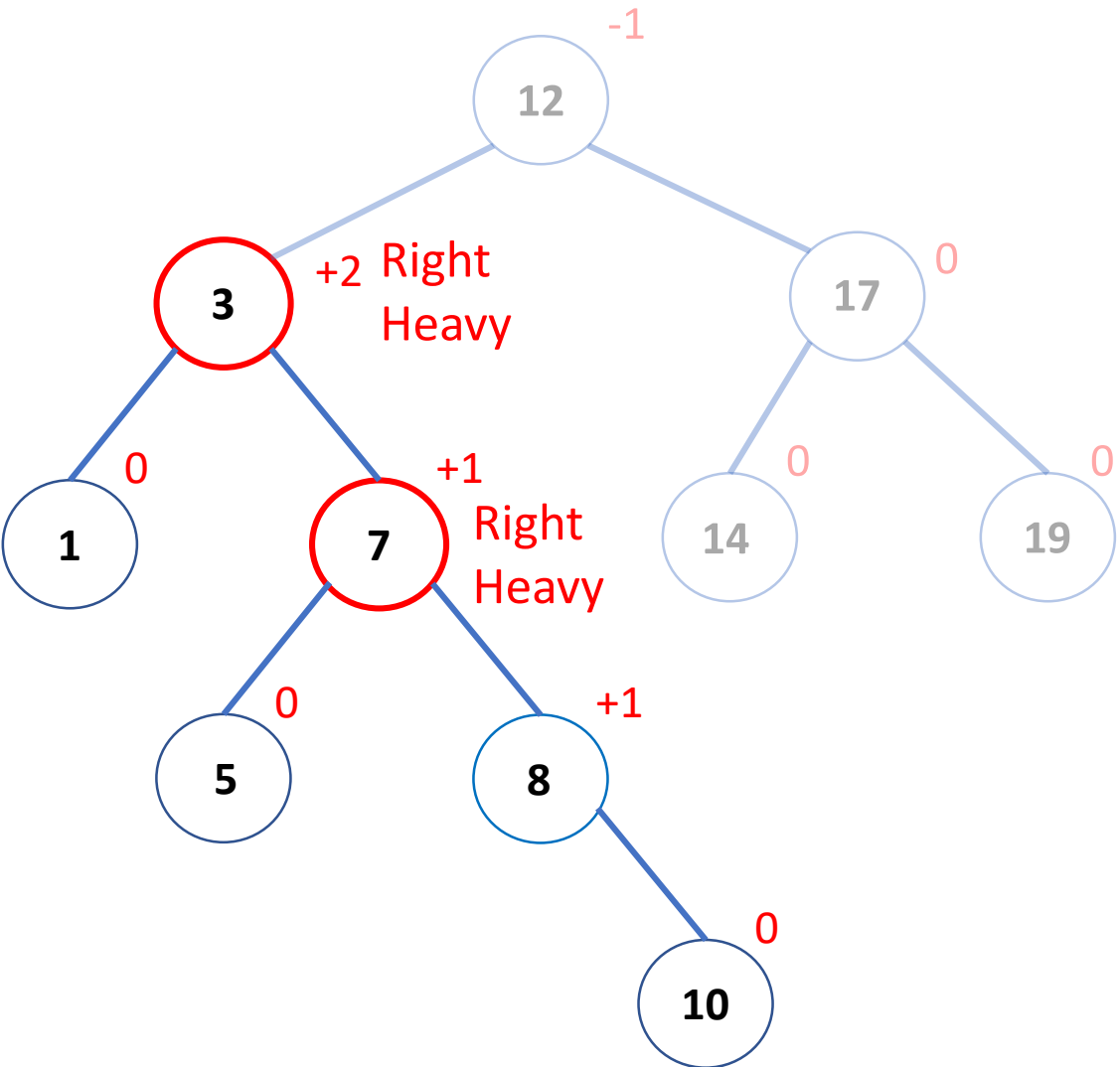
Rebalancing left subtree of 12:



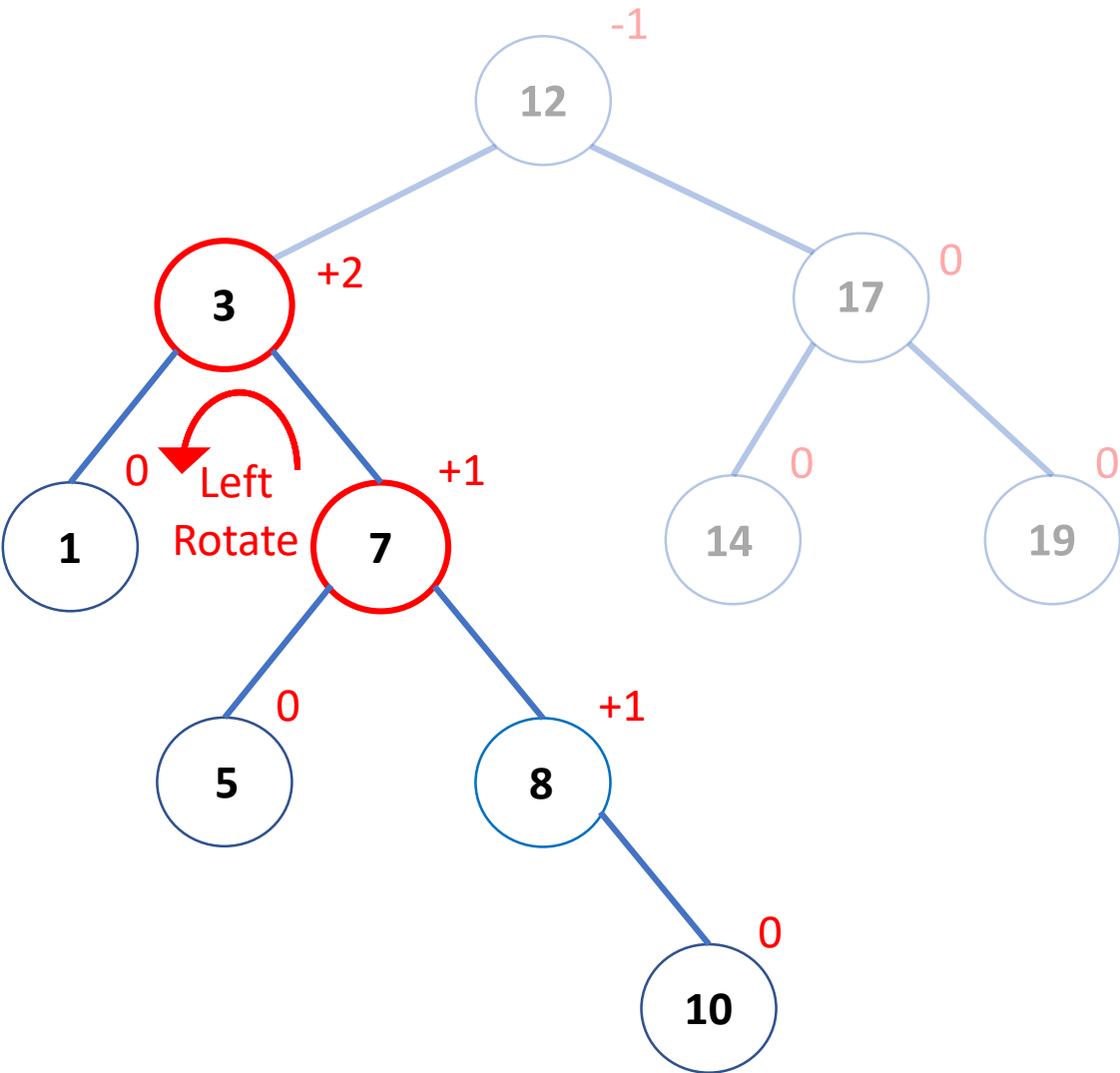
Rebalancing left subtree of 12:



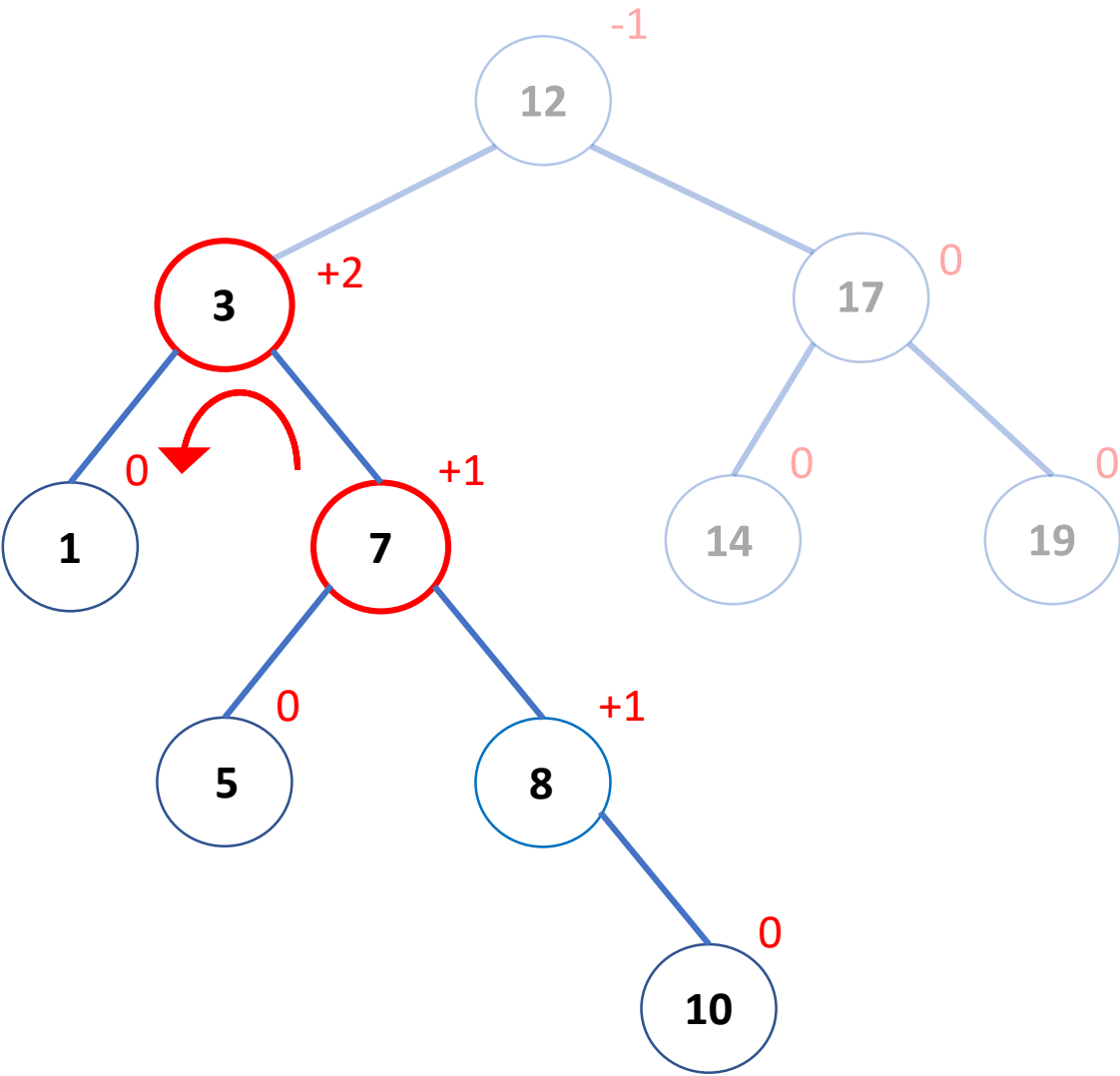
Rebalancing left subtree of 12:



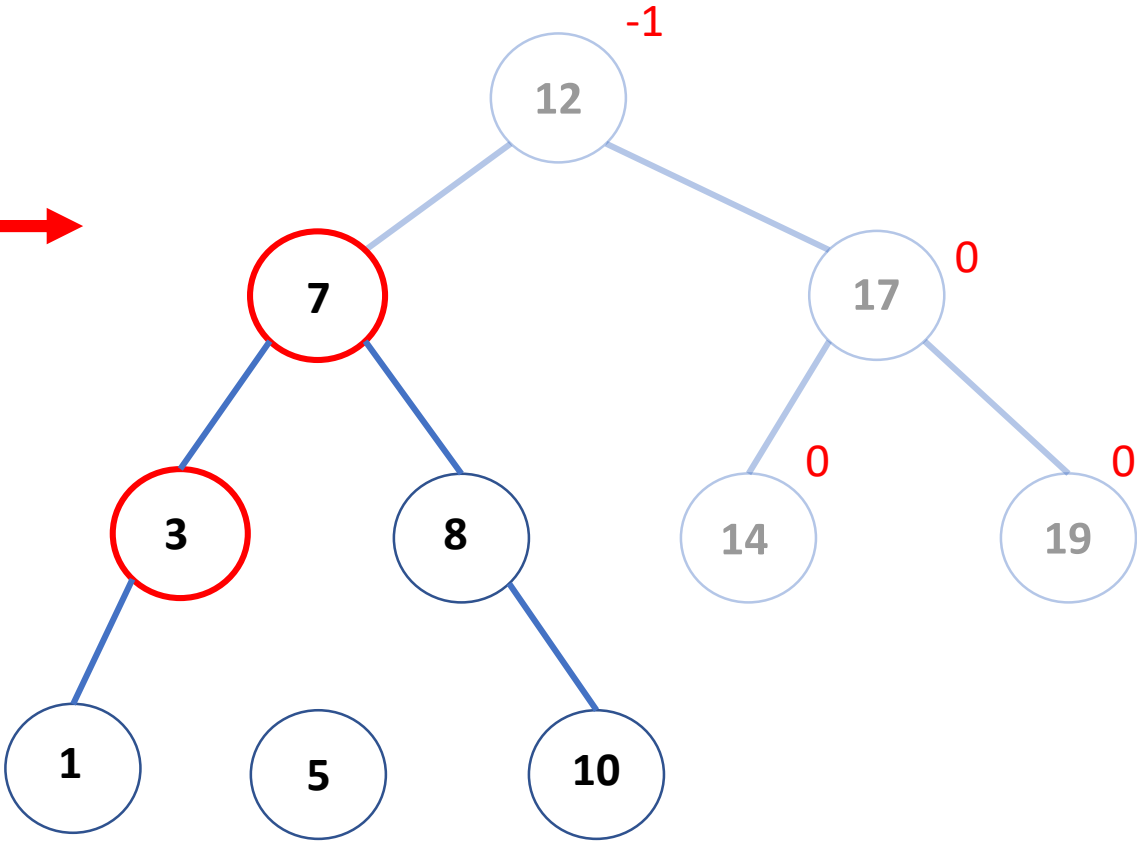
Rebalancing left subtree of 12:



Rebalancing left subtree of 12:

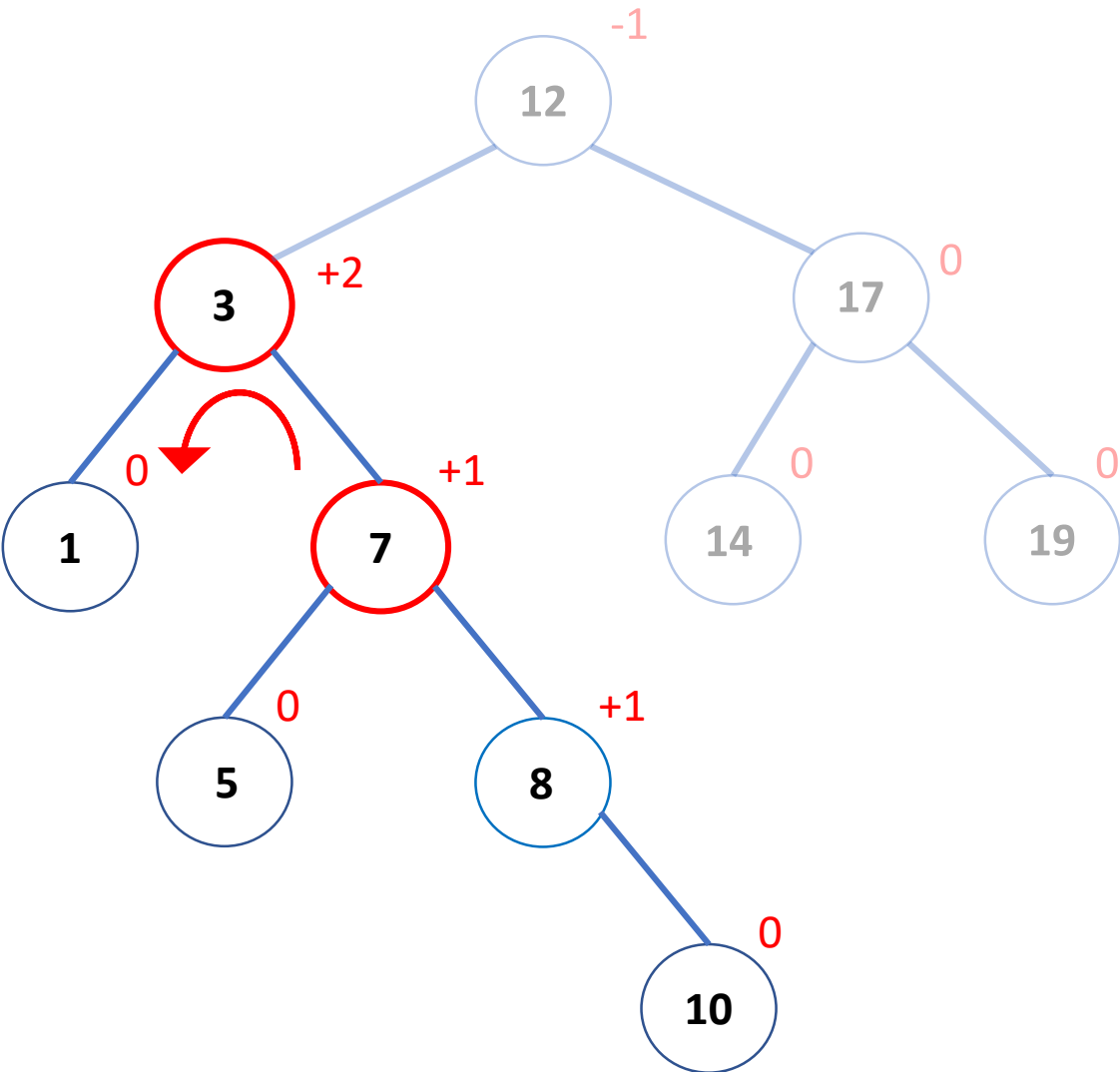


Left
Rotation

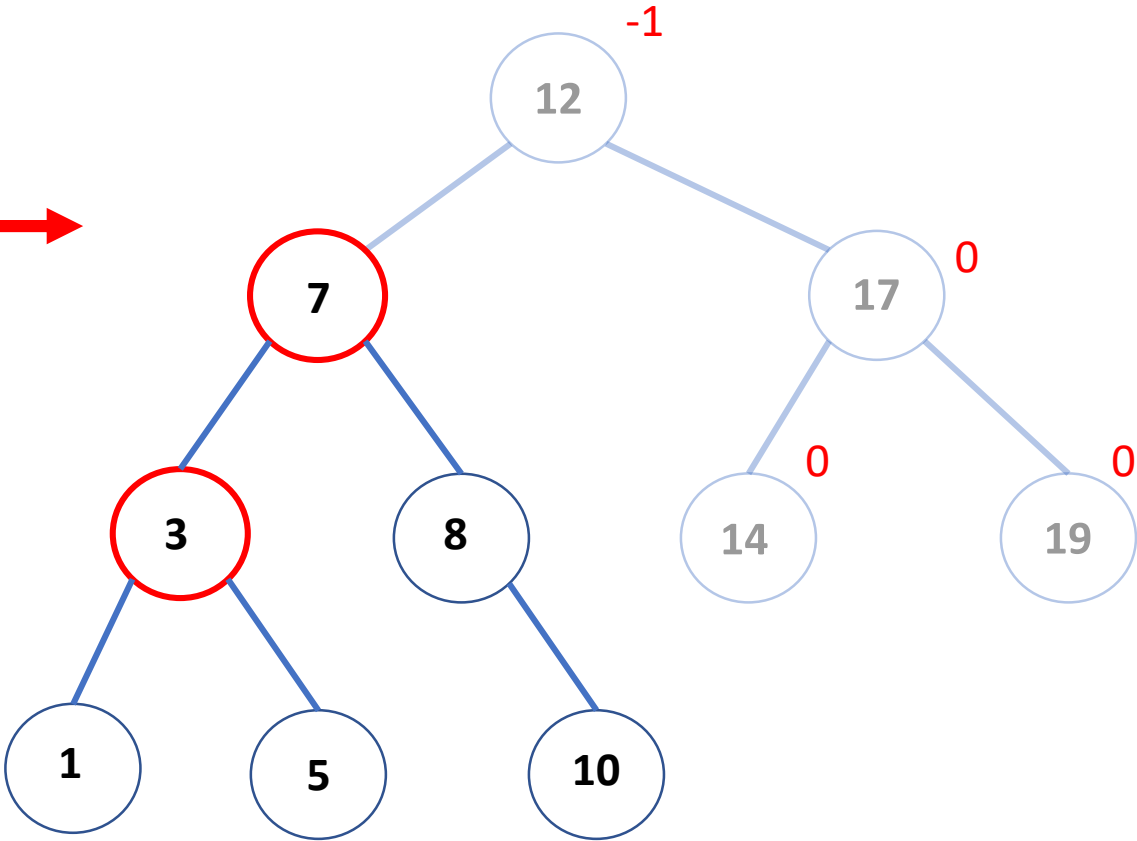


Where?

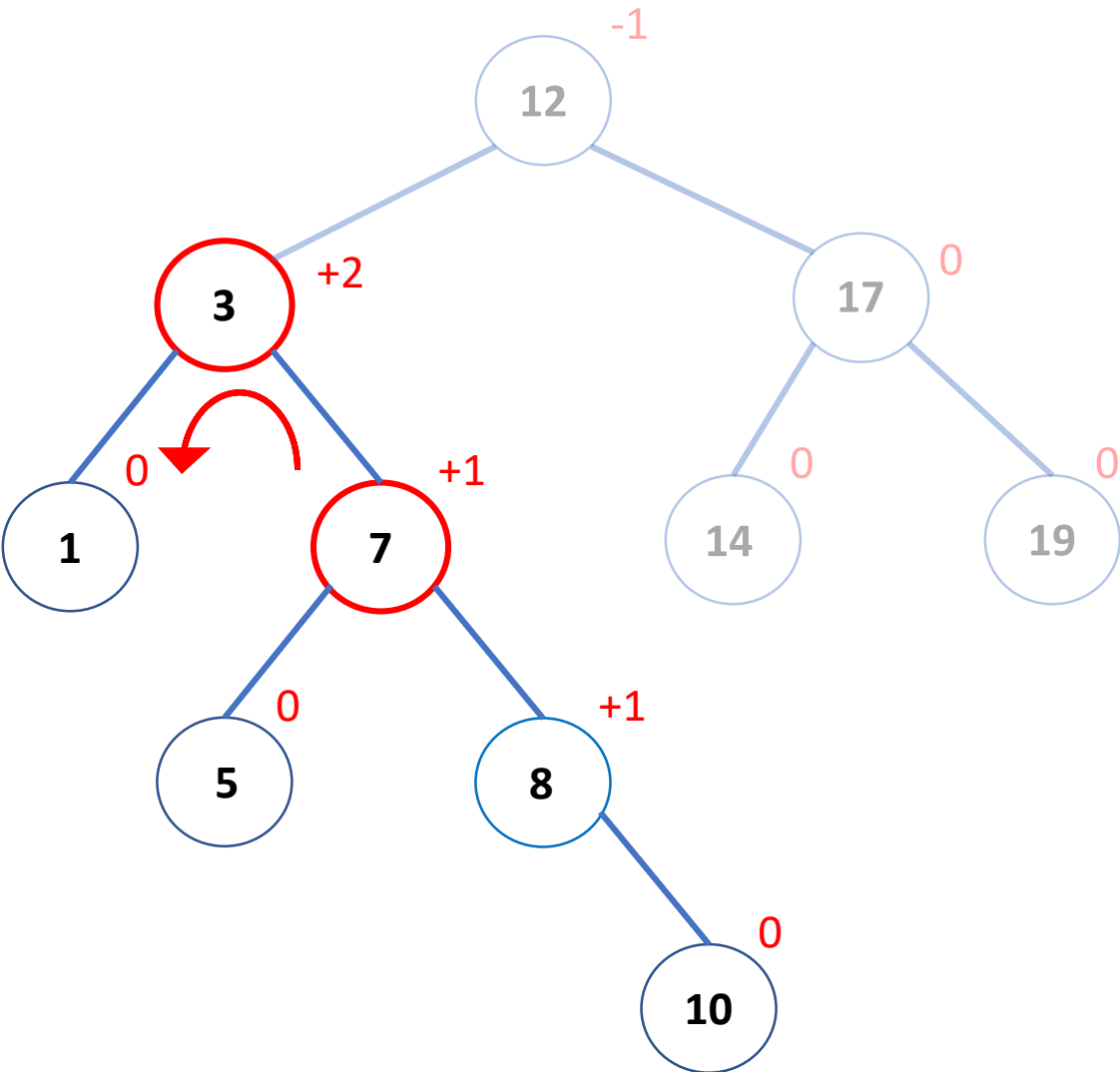
Rebalancing left subtree of 12:



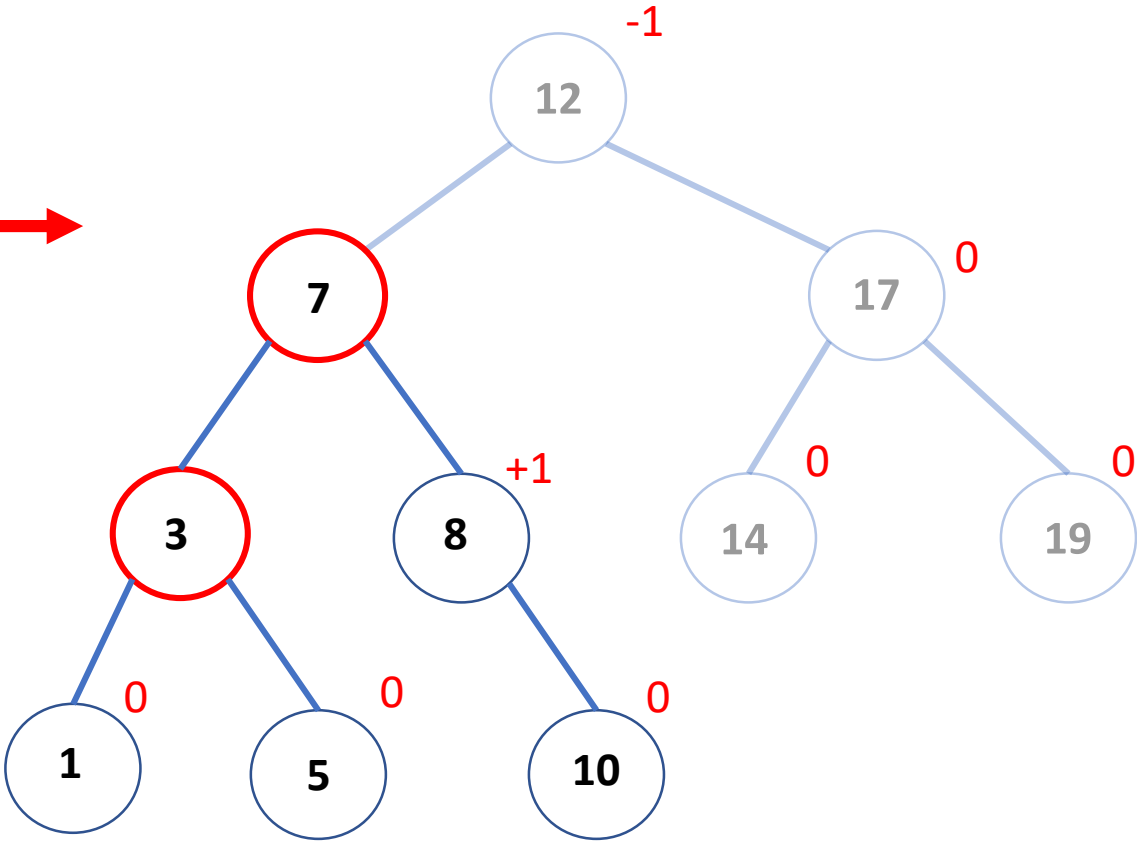
After Left
Rotation



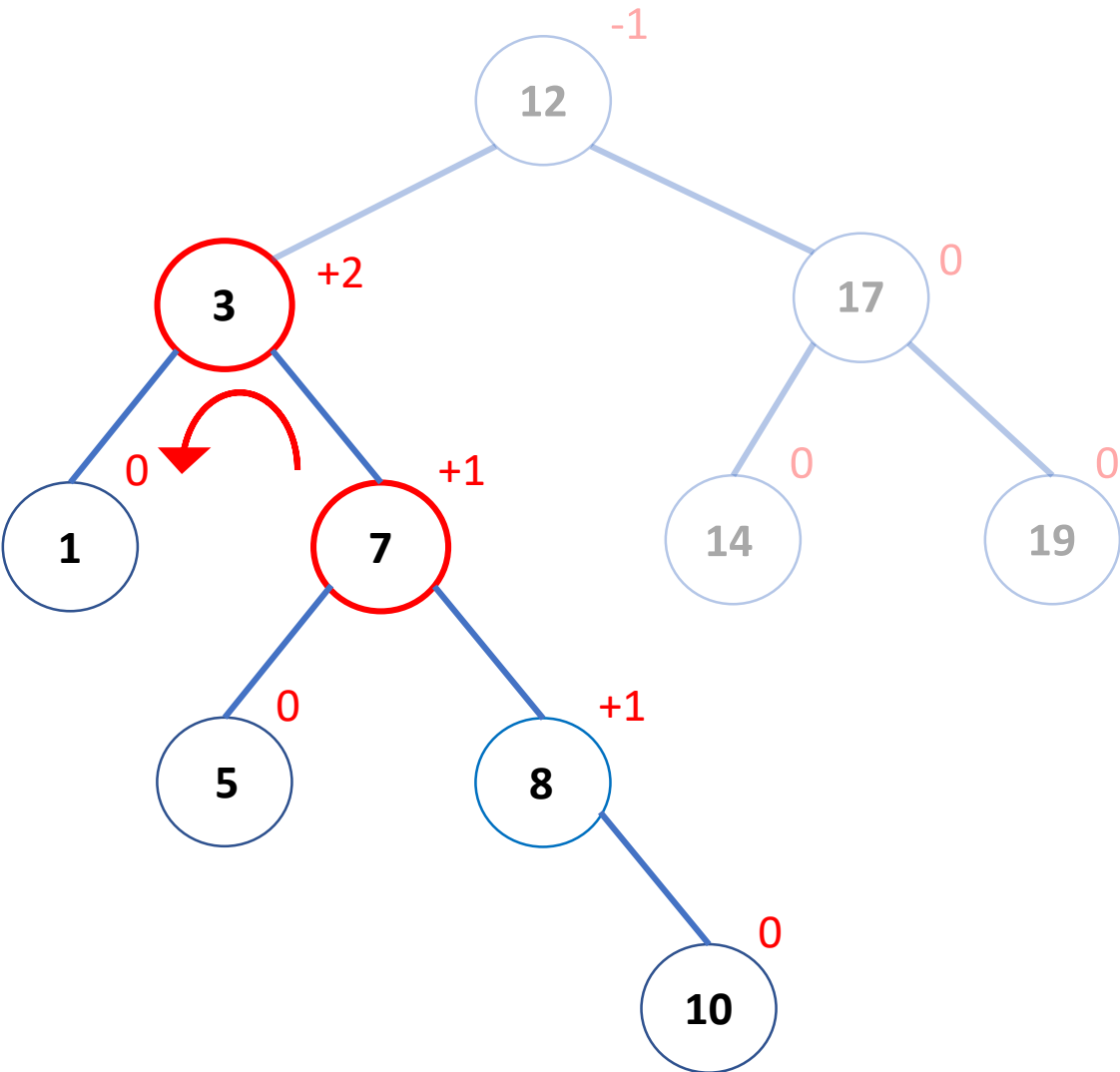
Rebalancing left subtree of 12:



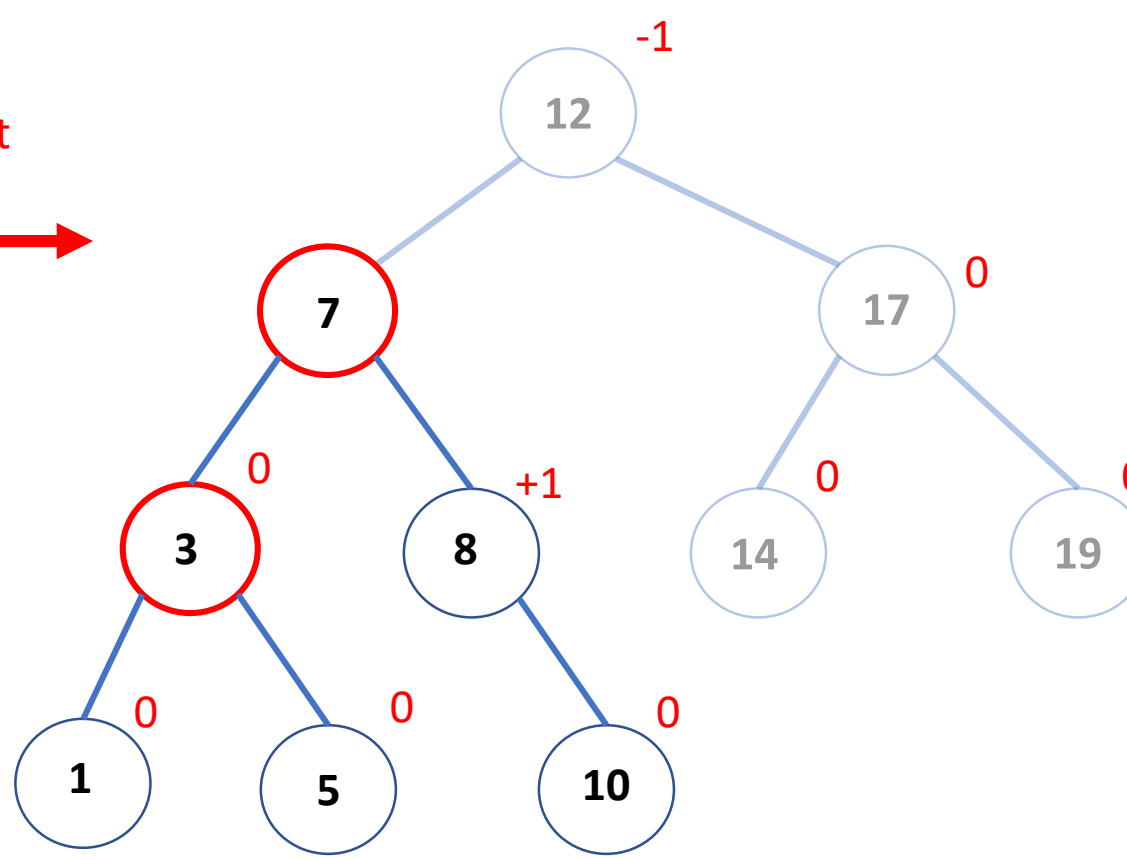
After Left
Rotation



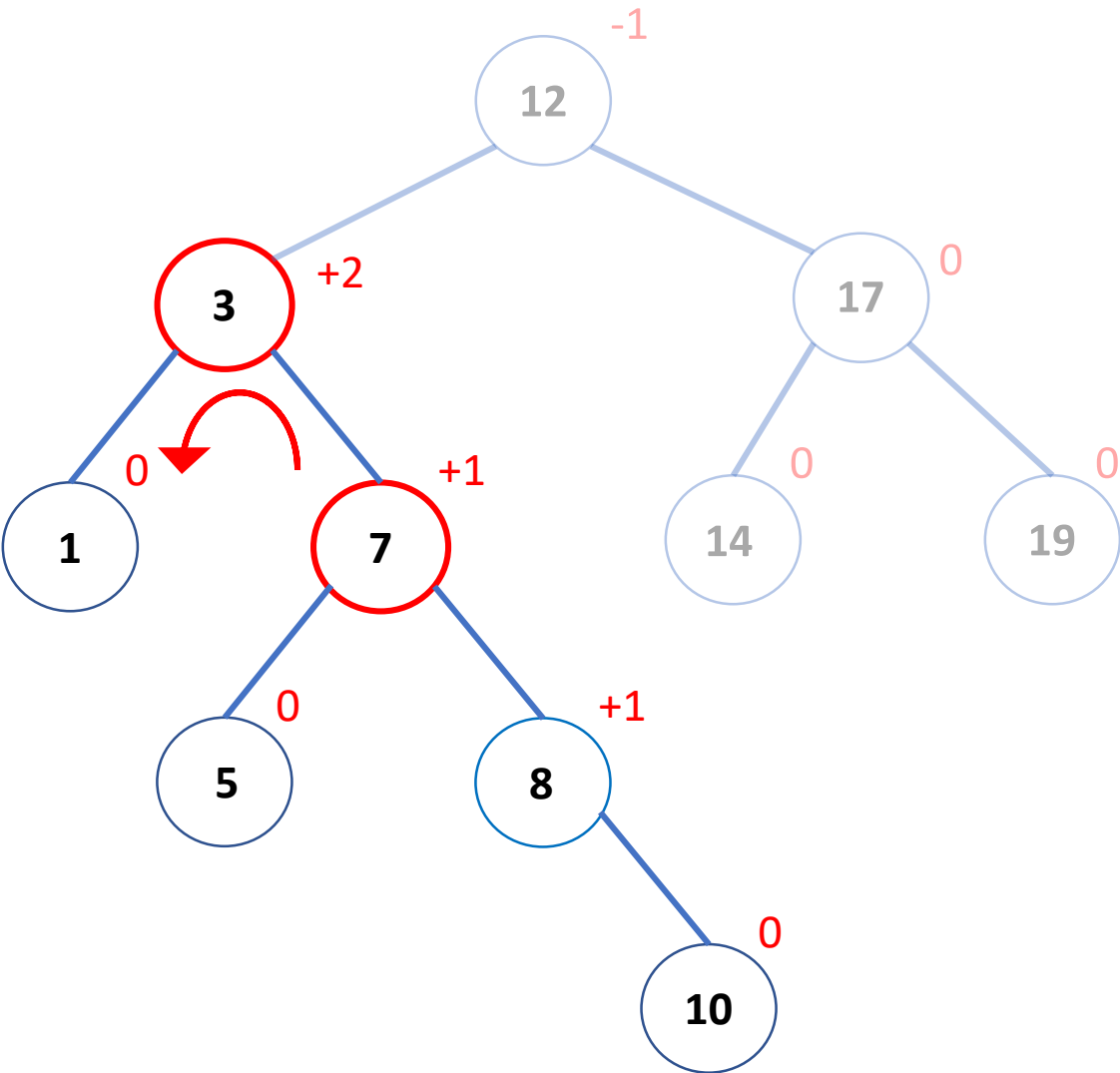
Rebalancing left subtree of 12:



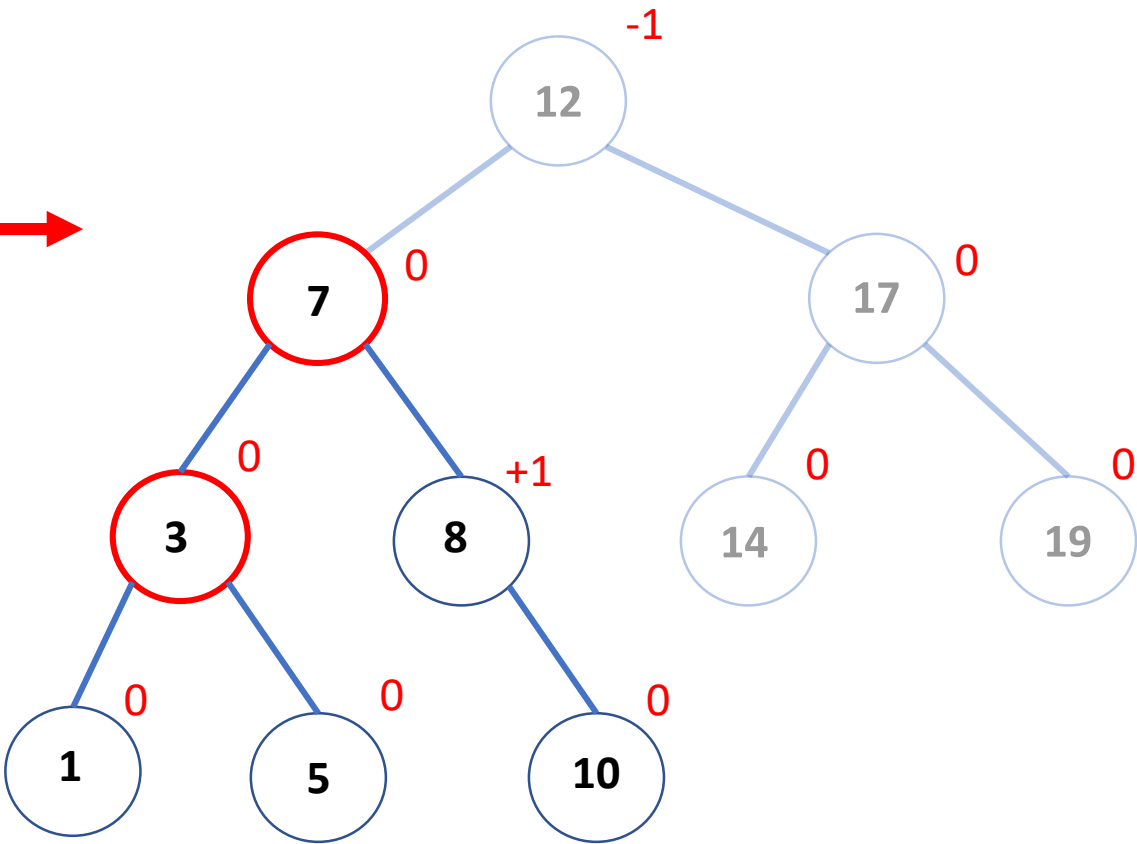
After Left Rotation



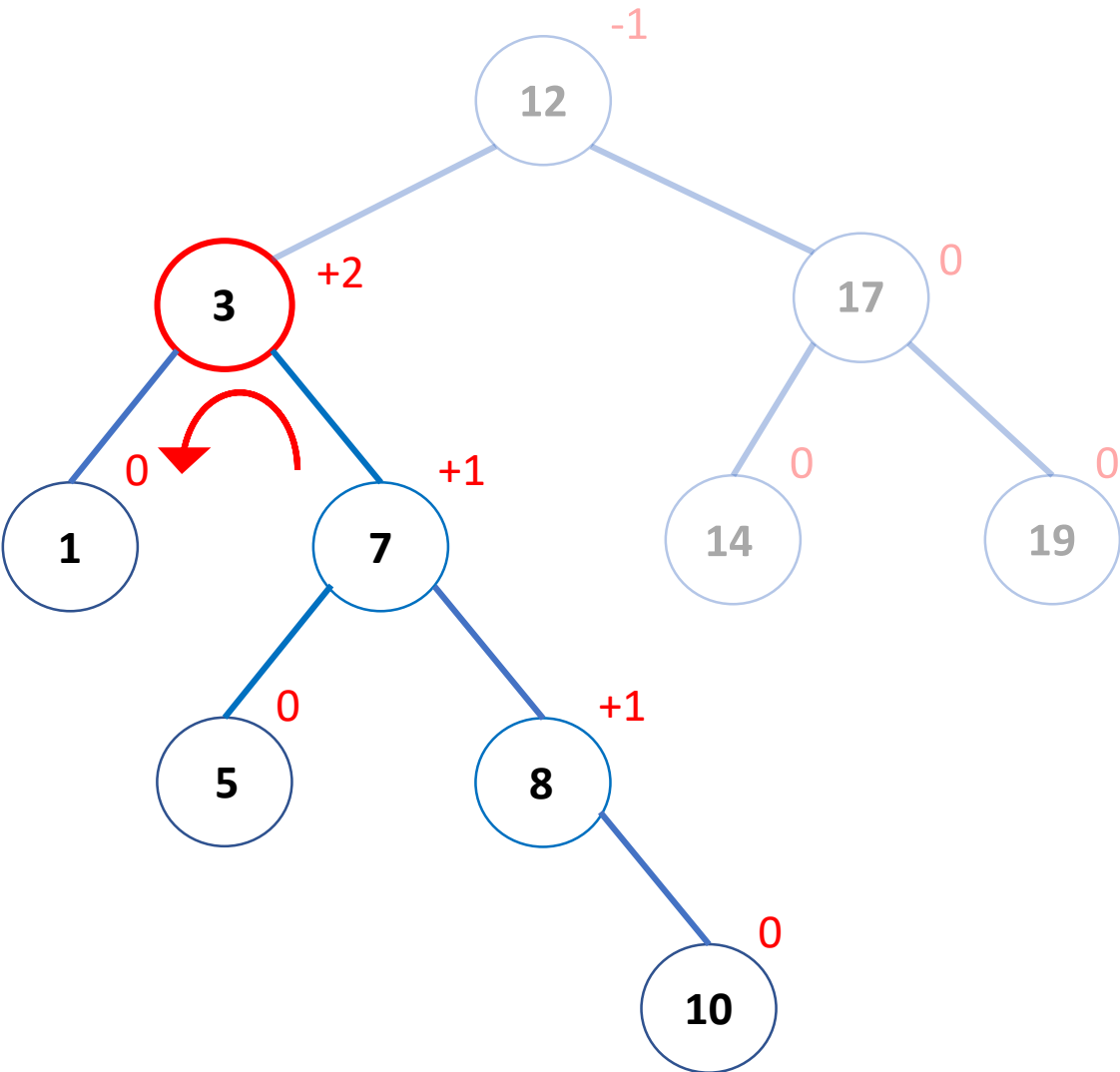
Rebalancing left subtree of 12:



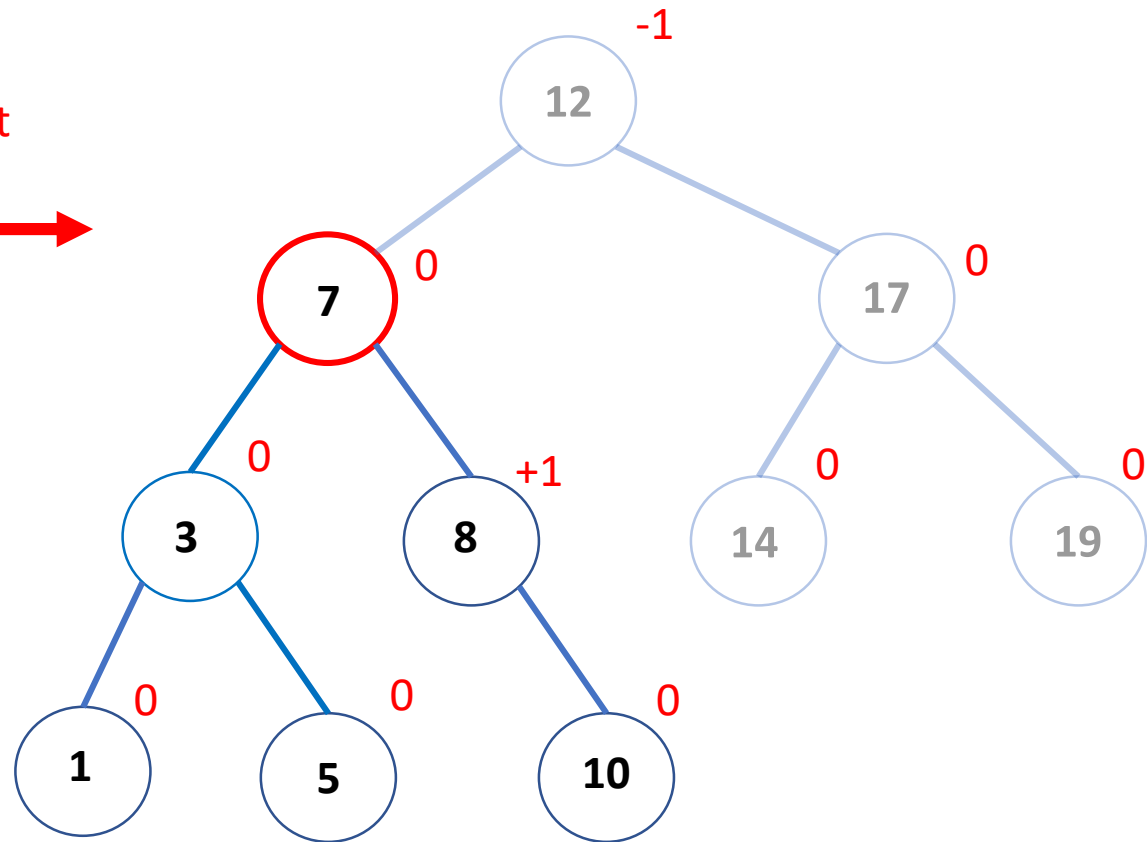
After Left
Rotation



Rebalancing left subtree of 12:

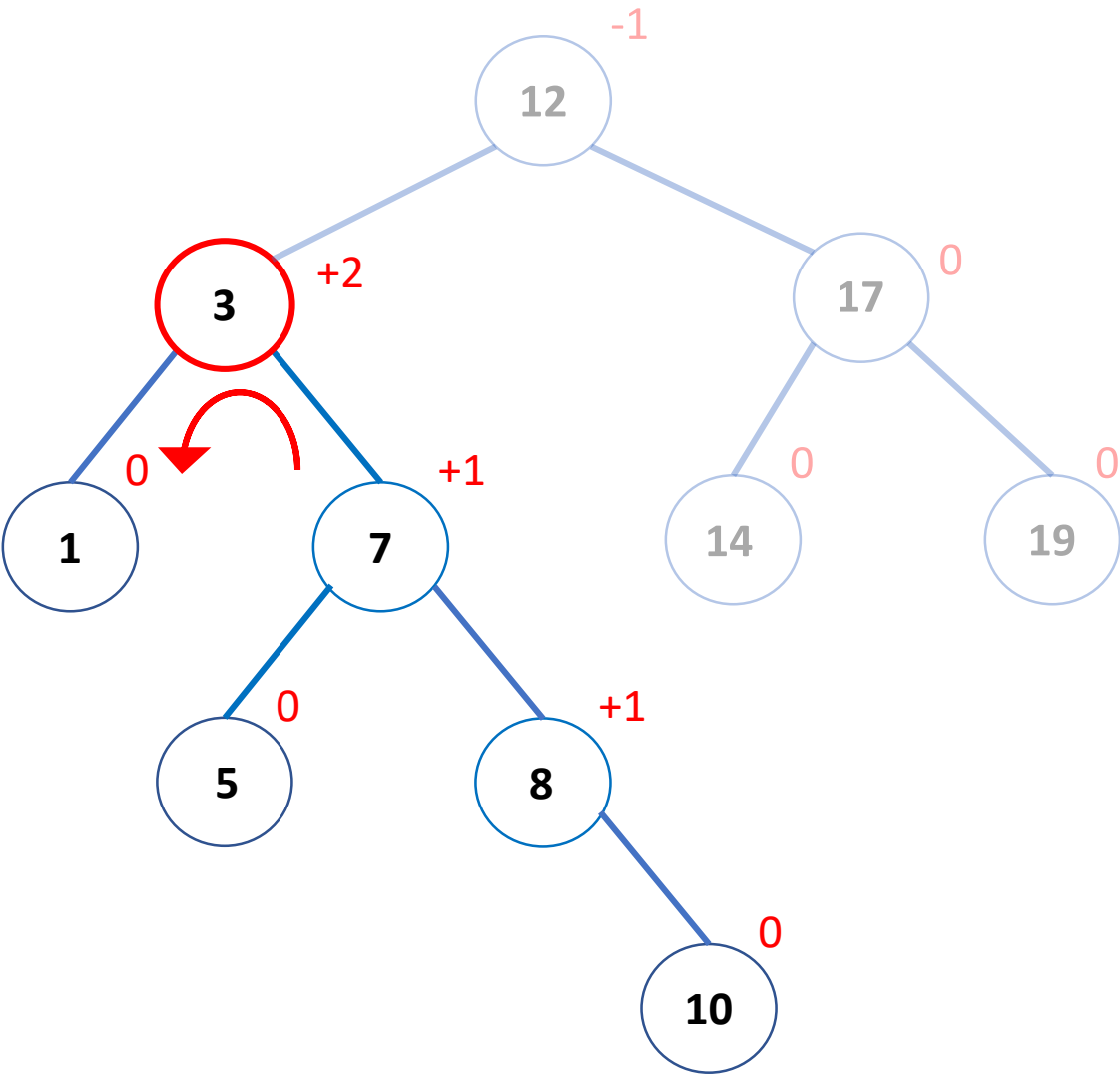


After Left
Rotation

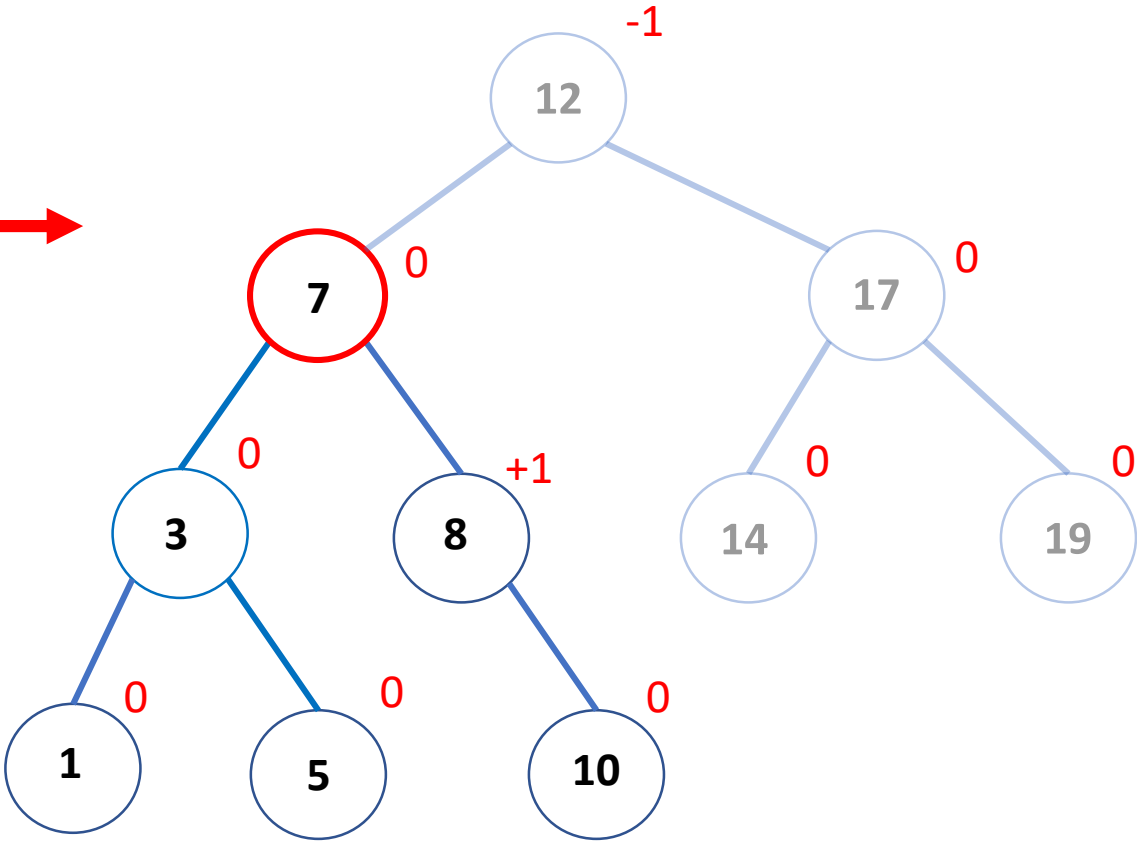


Left subtree of 12:

Rebalancing left subtree of 12:

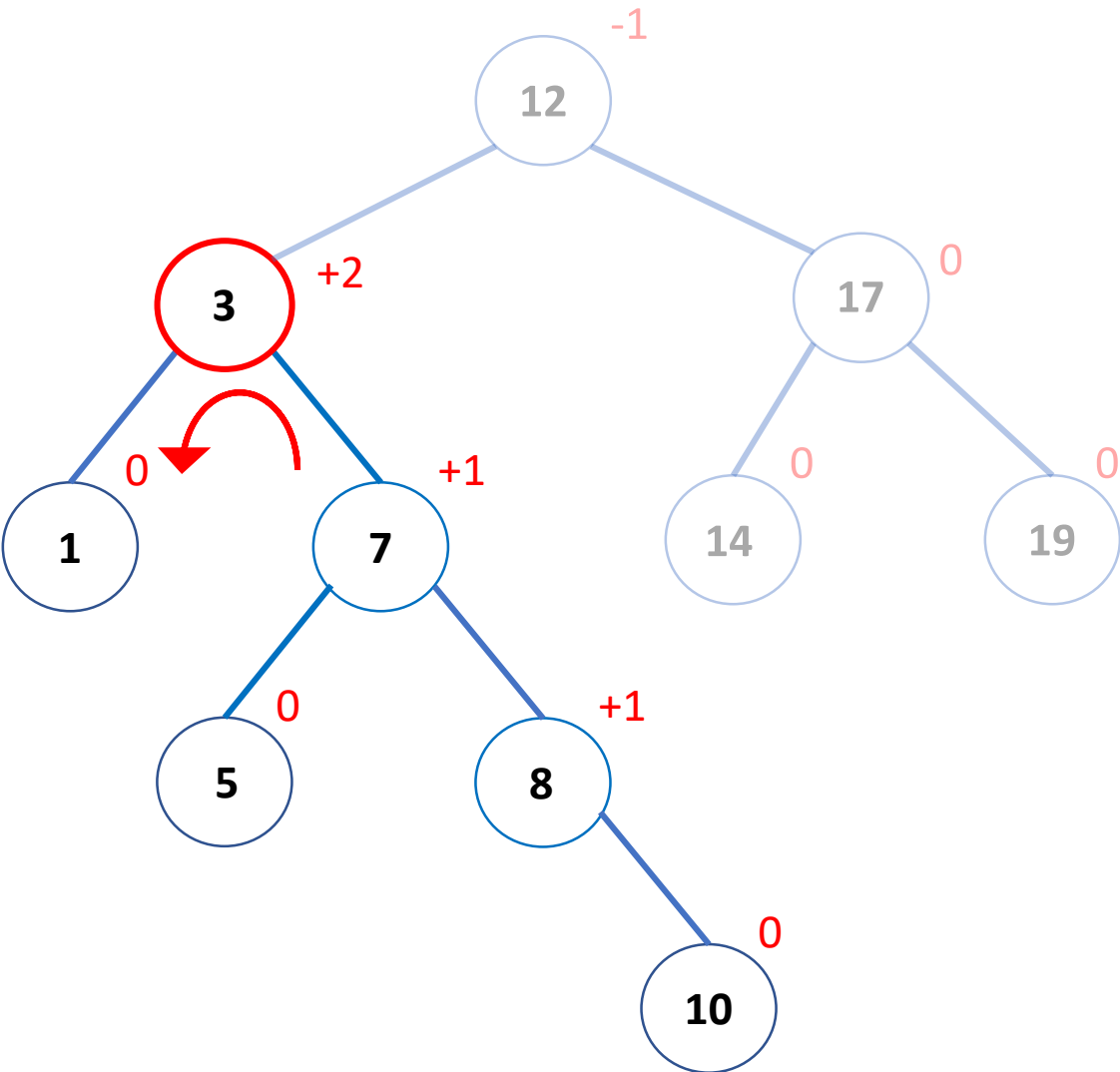


After Left
Rotation

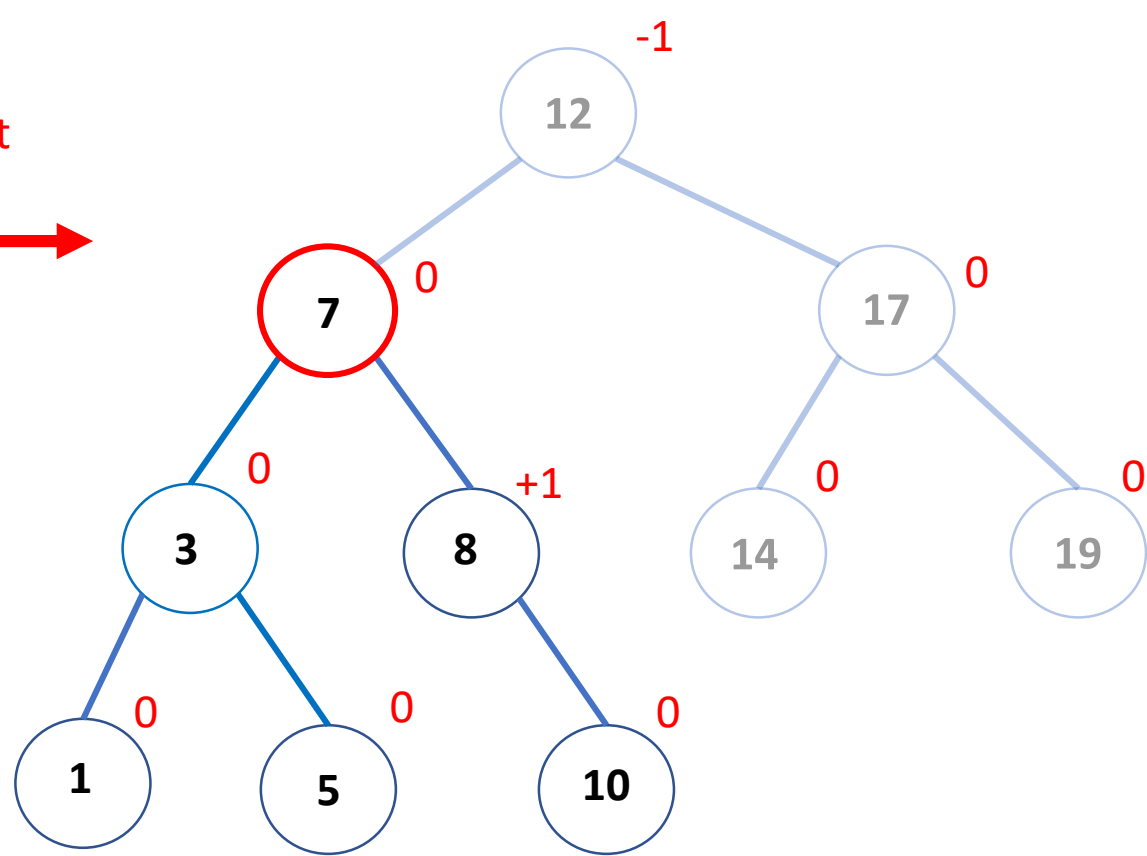


Left subtree of 12:
• Is rebalanced

Rebalancing left subtree of 12:



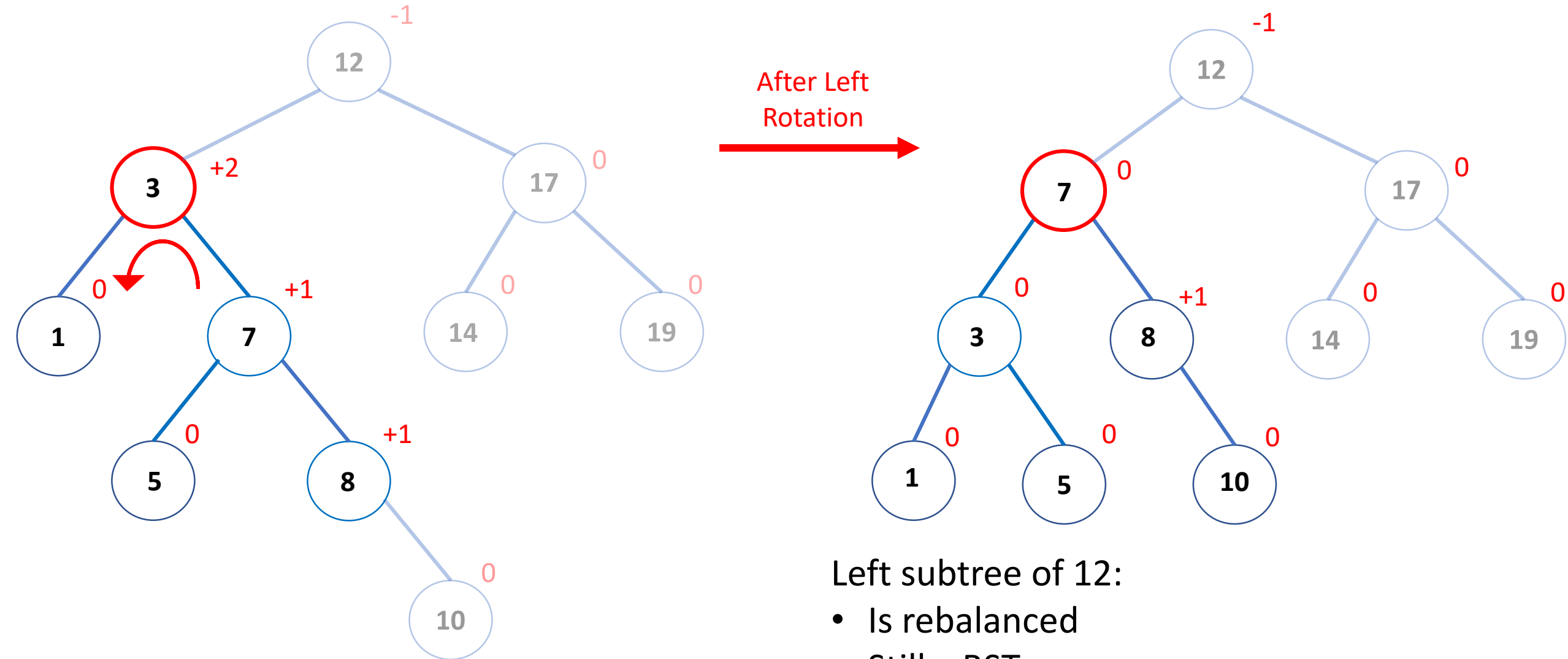
After Left Rotation



Left subtree of 12:

- Is rebalanced
- Still a BST

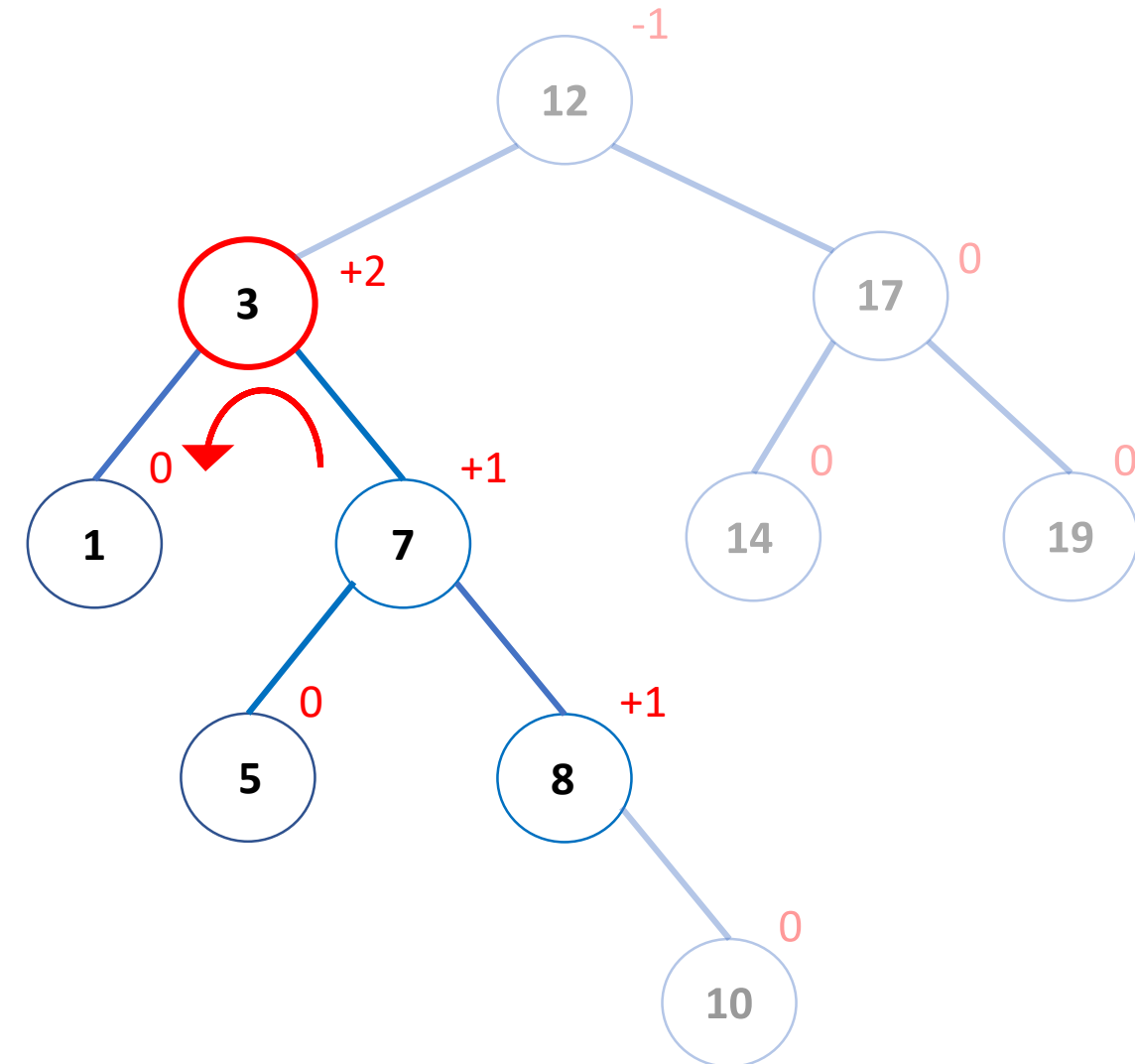
Rebalancing left subtree of 12:



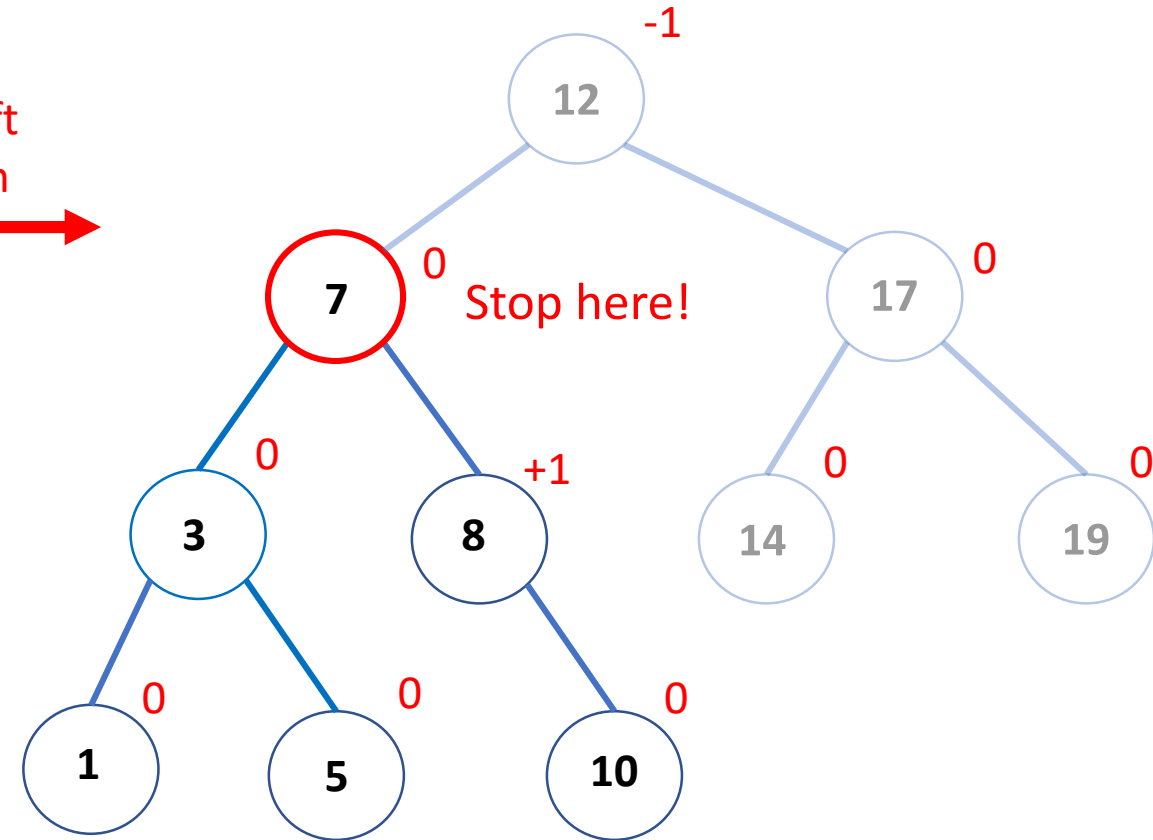
Left subtree of 12:

- Is rebalanced
- Still a BST
- **Bonus:** height same as before inserting 10

Rebalancing left subtree of 12:



After Left
Rotation →

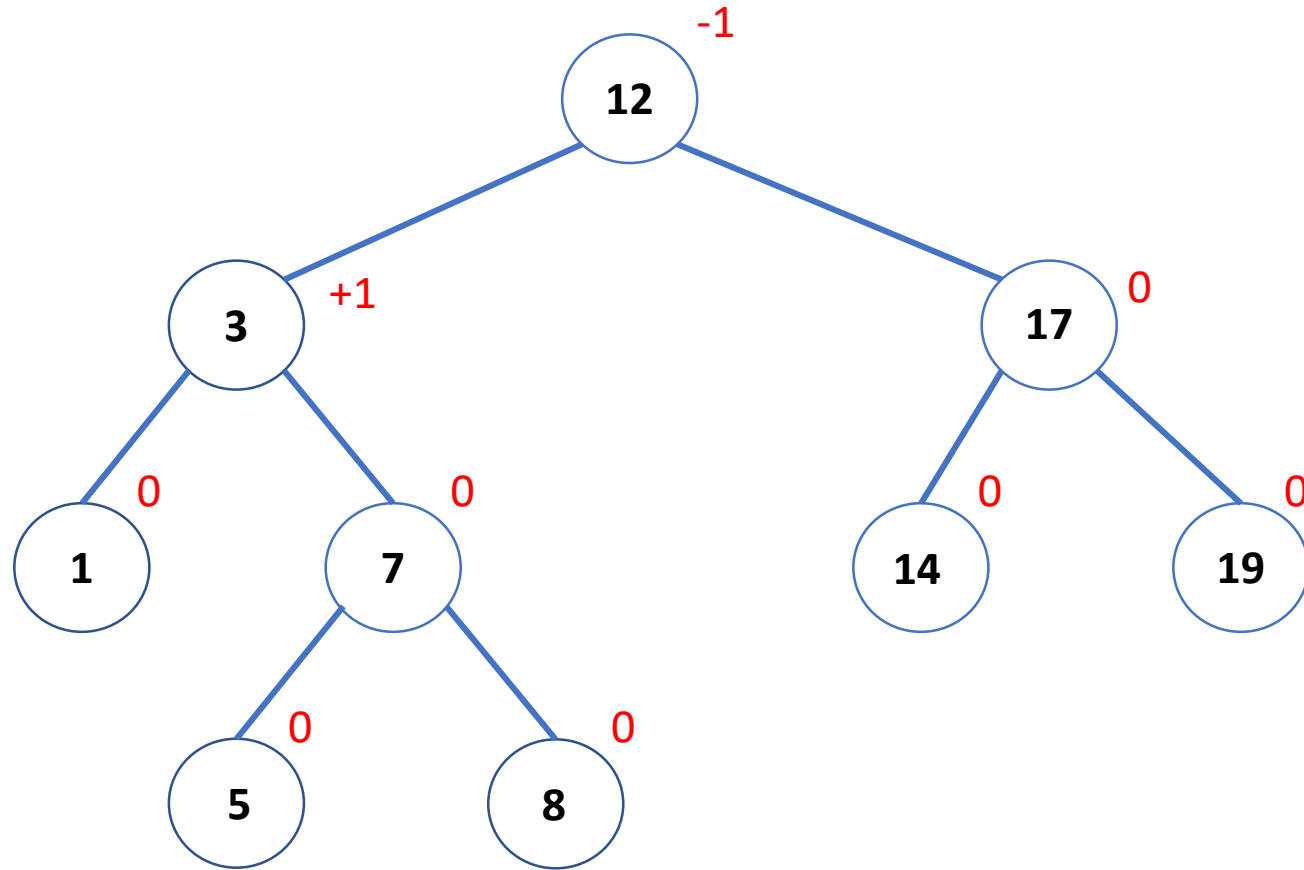


Left subtree of 12:

- Is rebalanced
- Still a BST
- **Bonus:** height same as before inserting 10

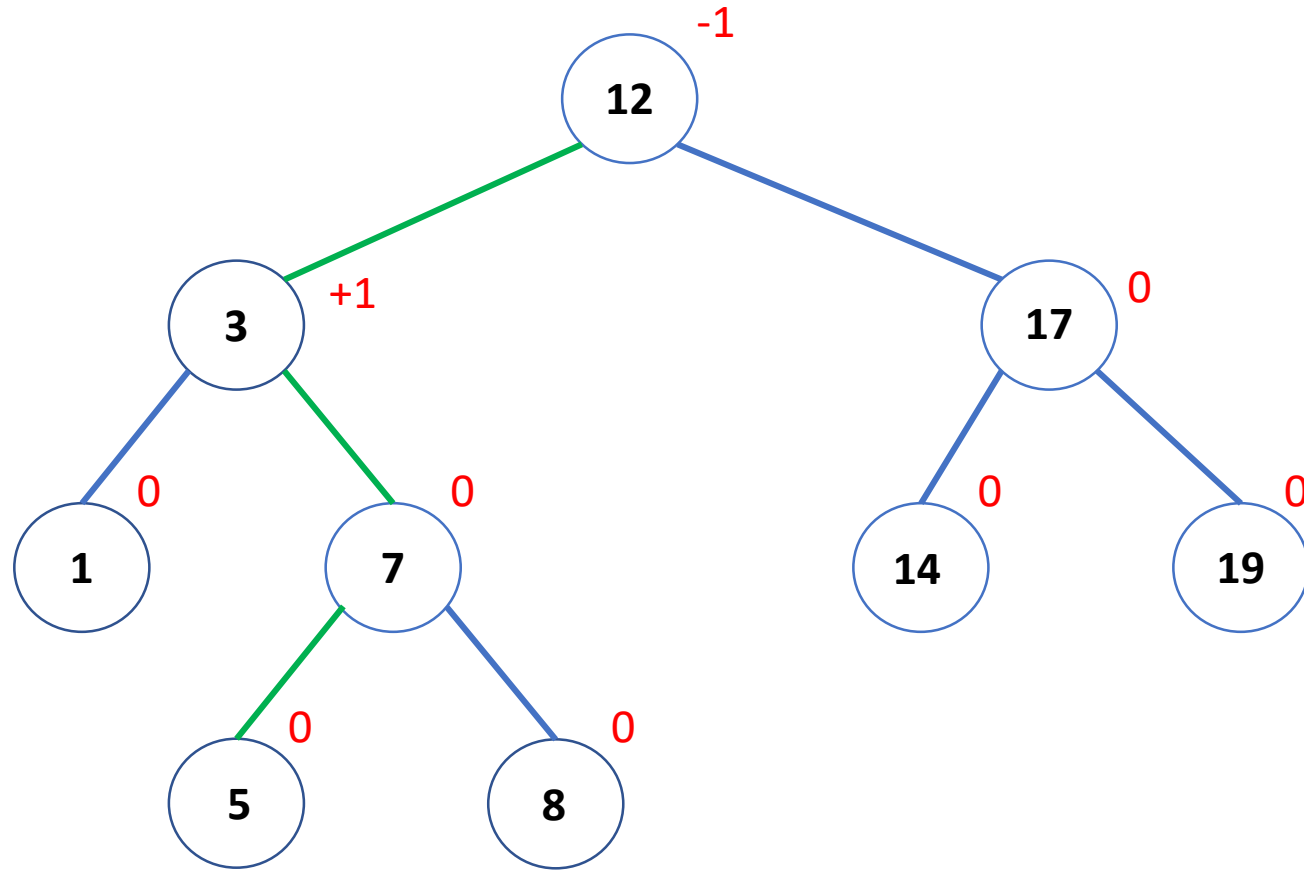
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 6)



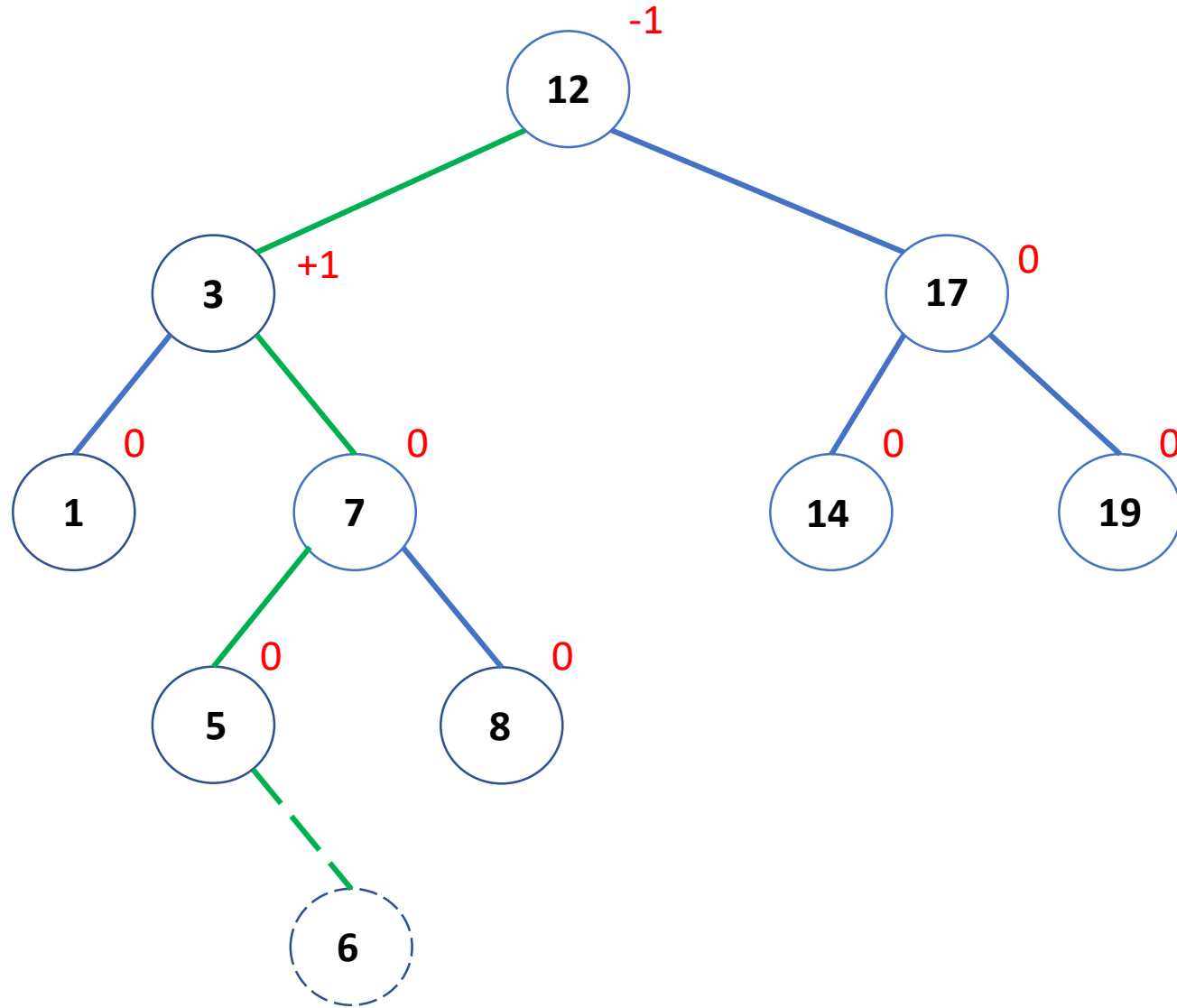
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 6)



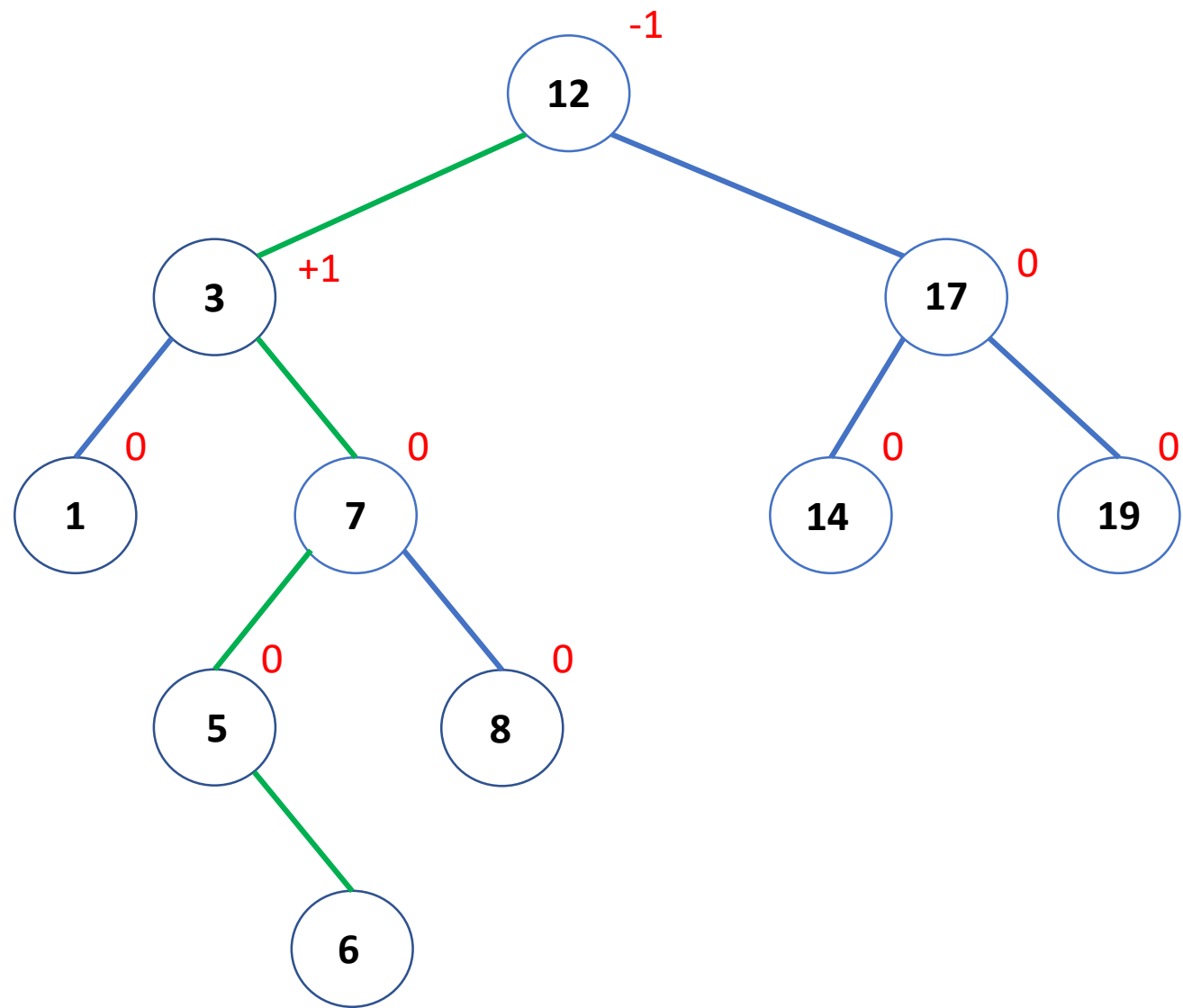
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

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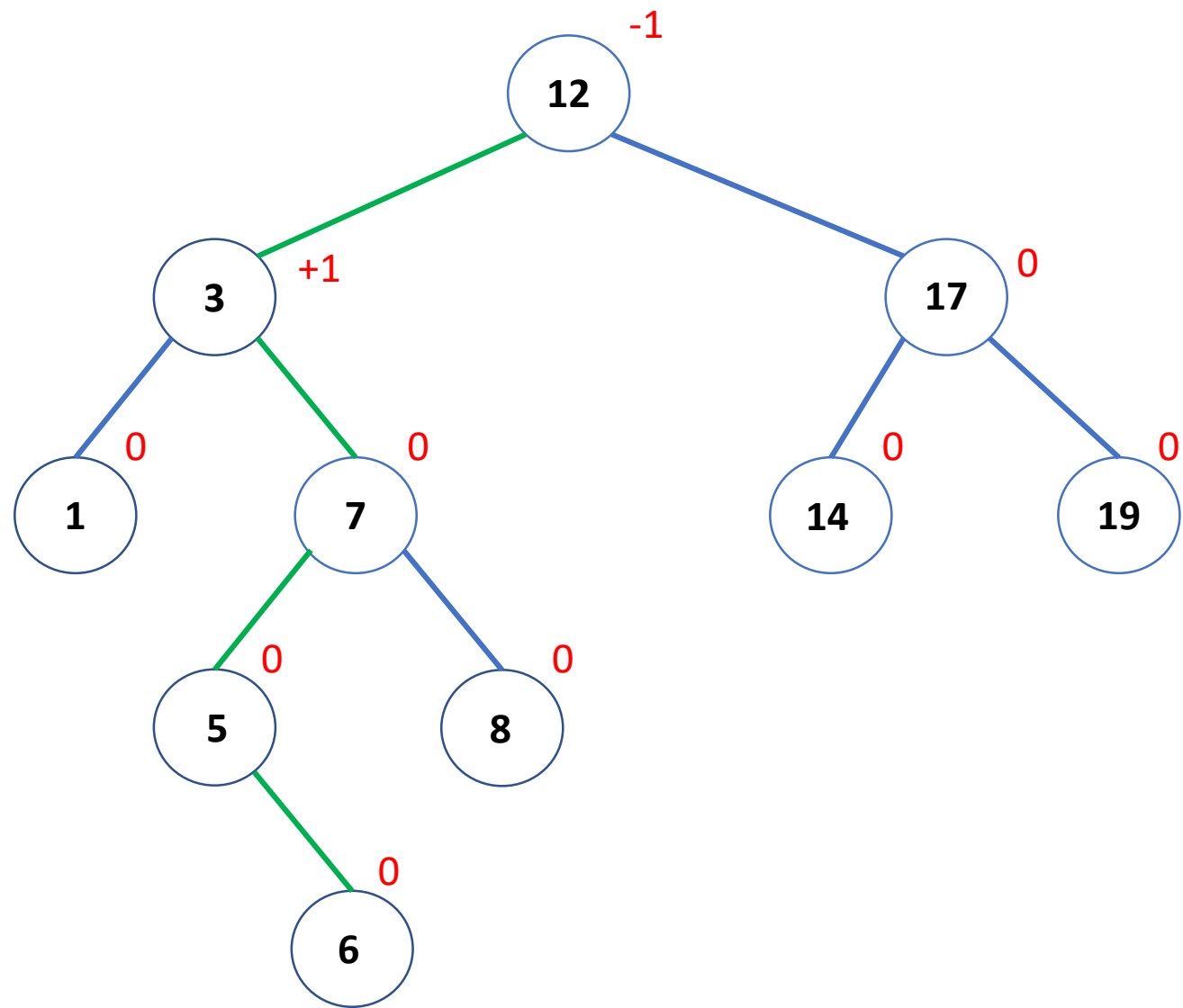
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 6)



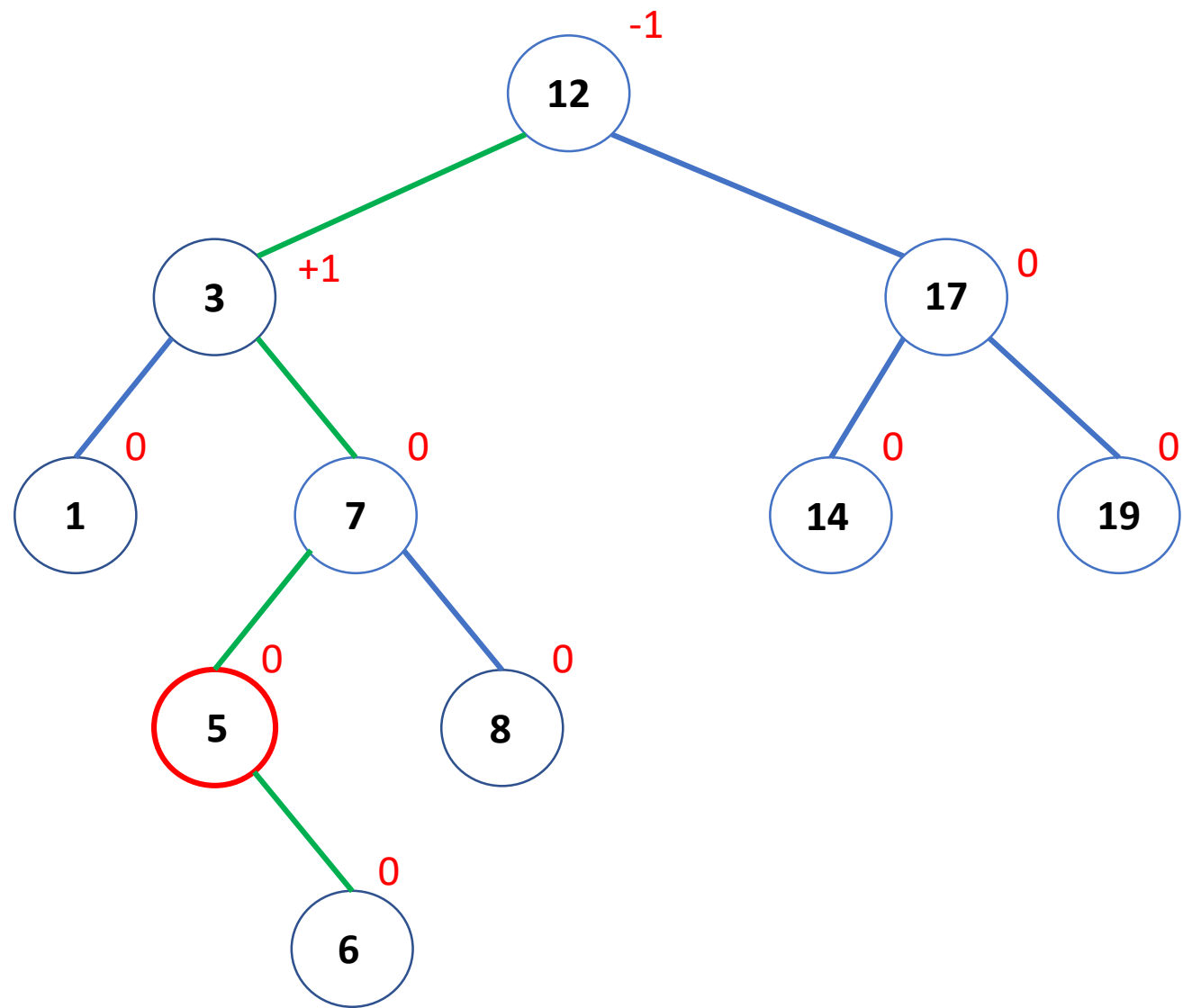
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 6)



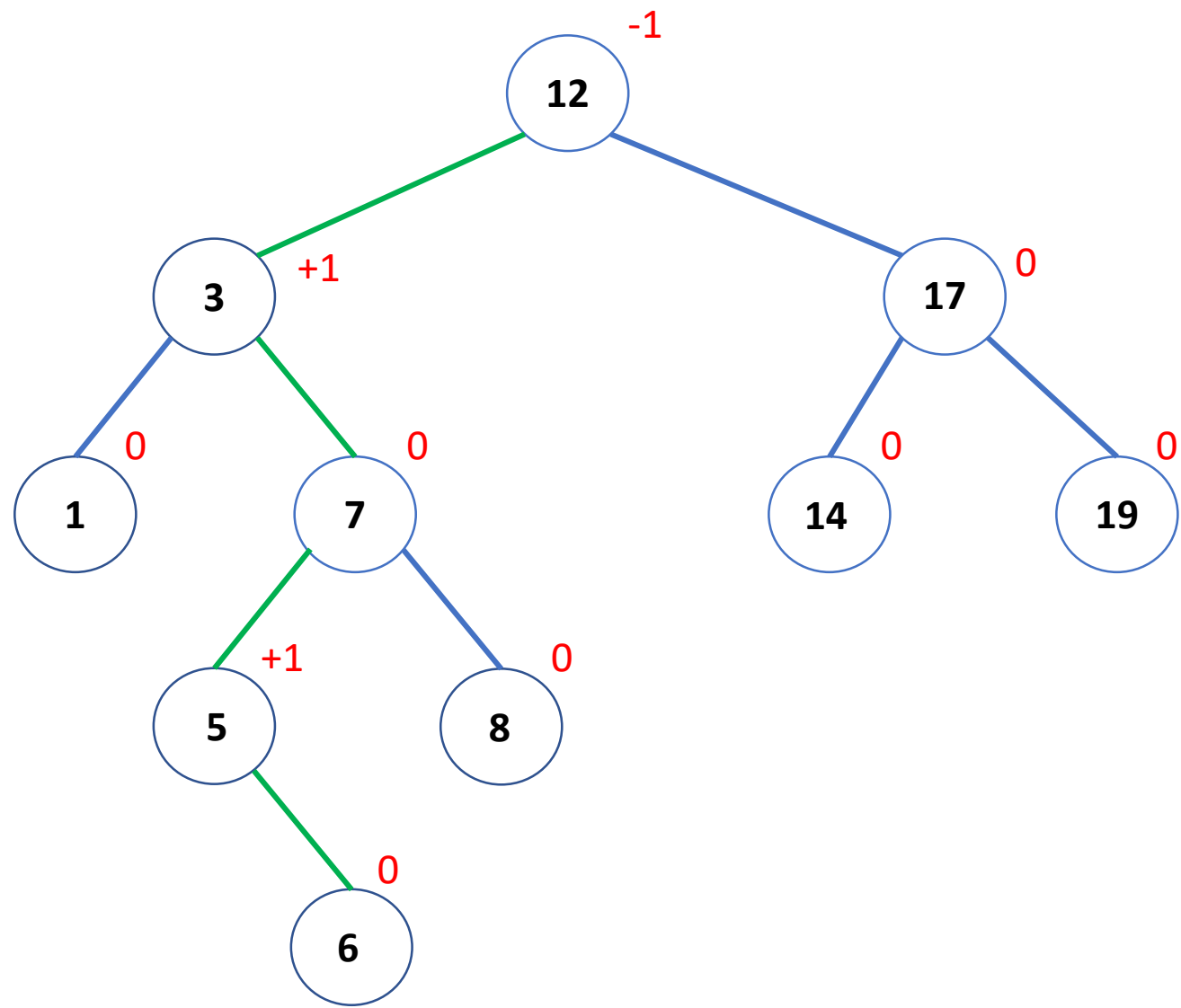
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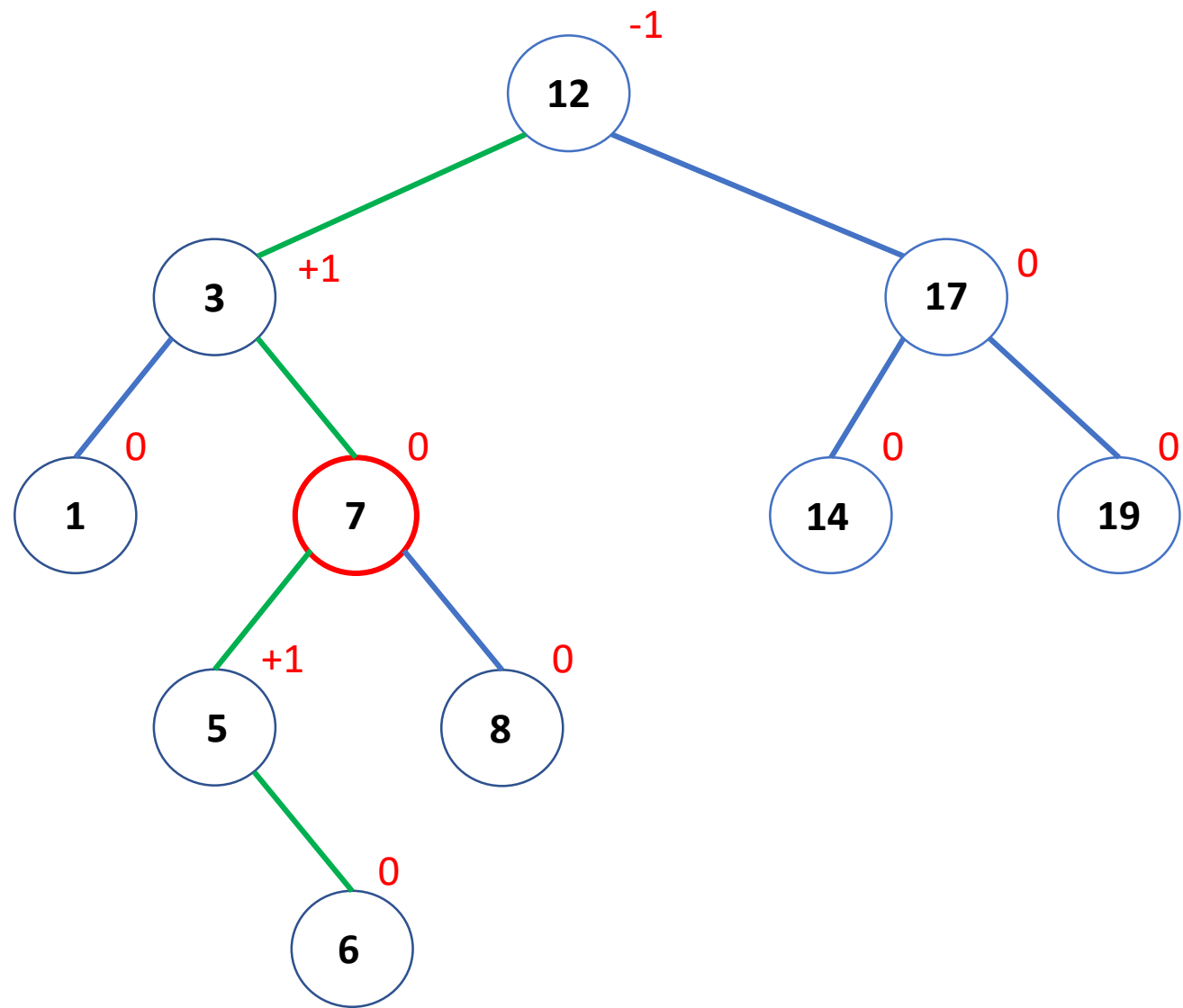
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

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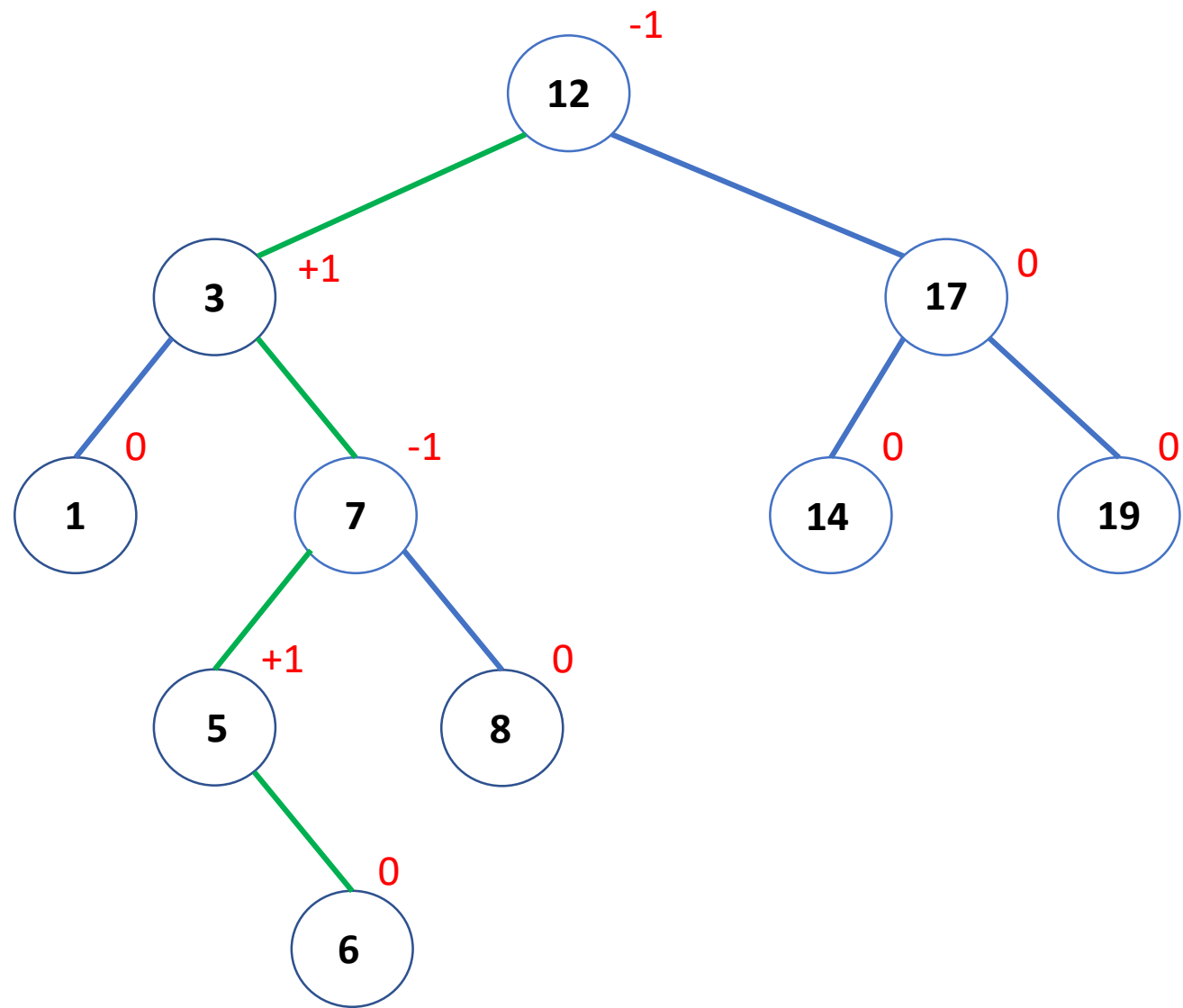
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

Insert(T, 6)



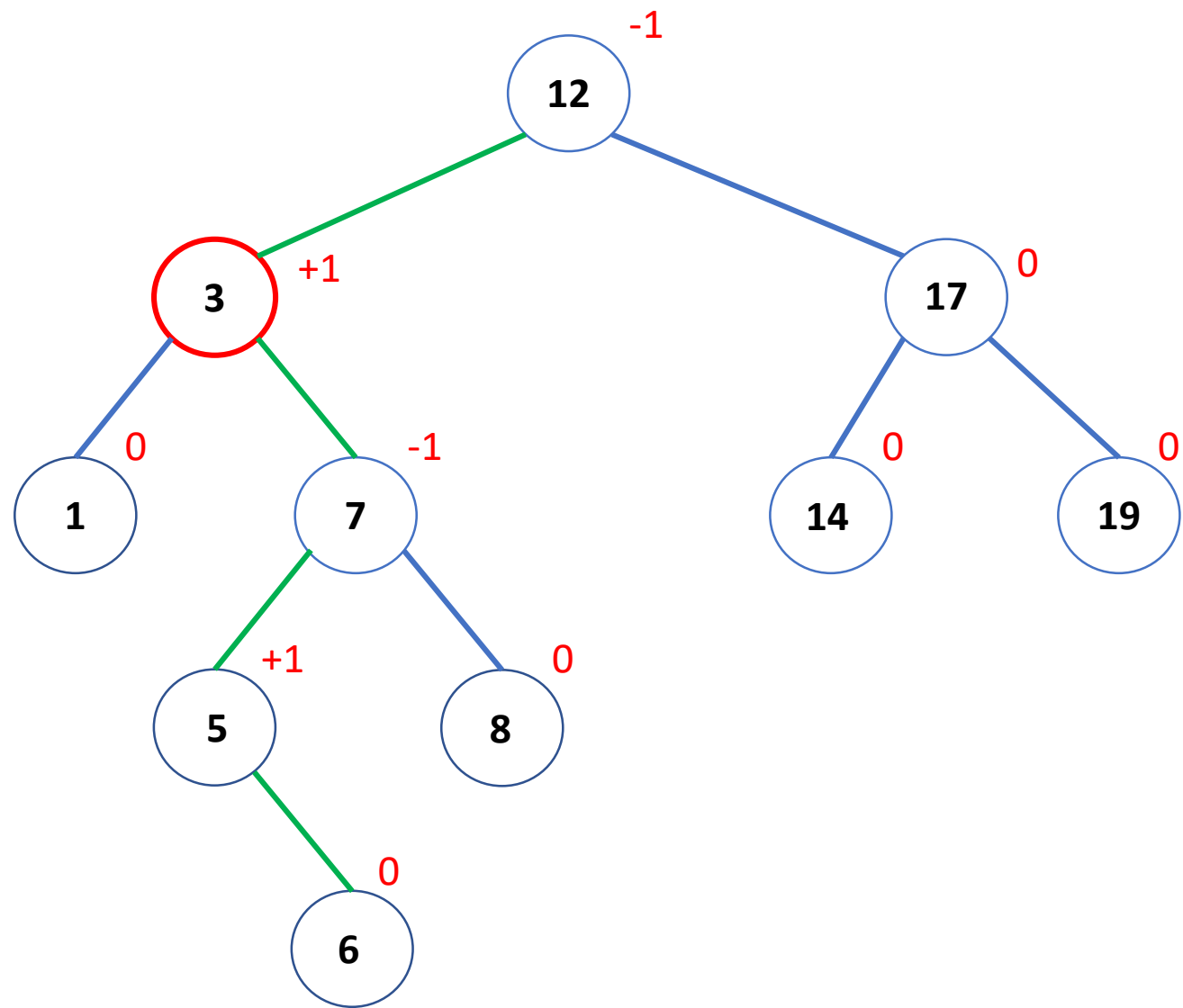
Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

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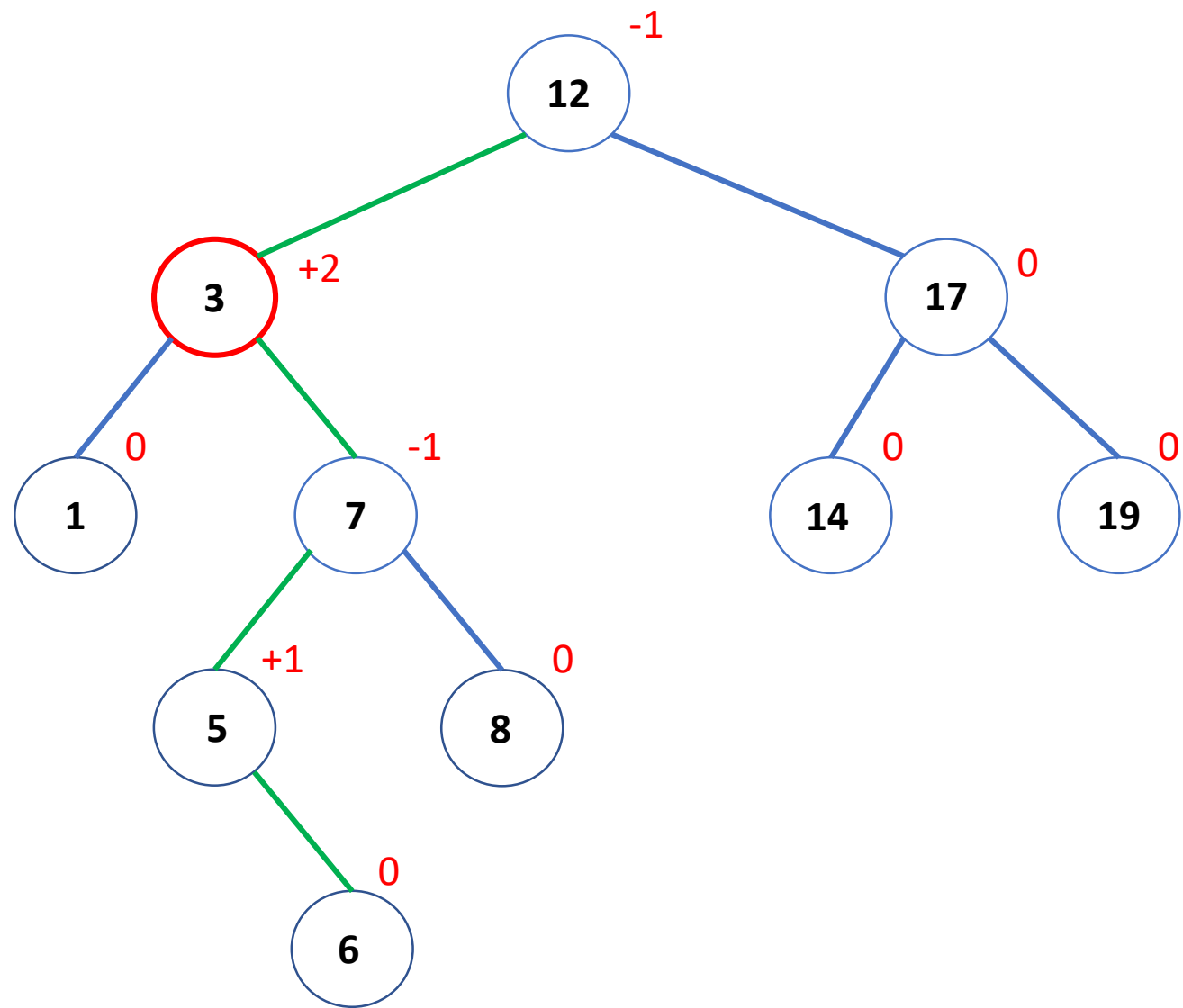
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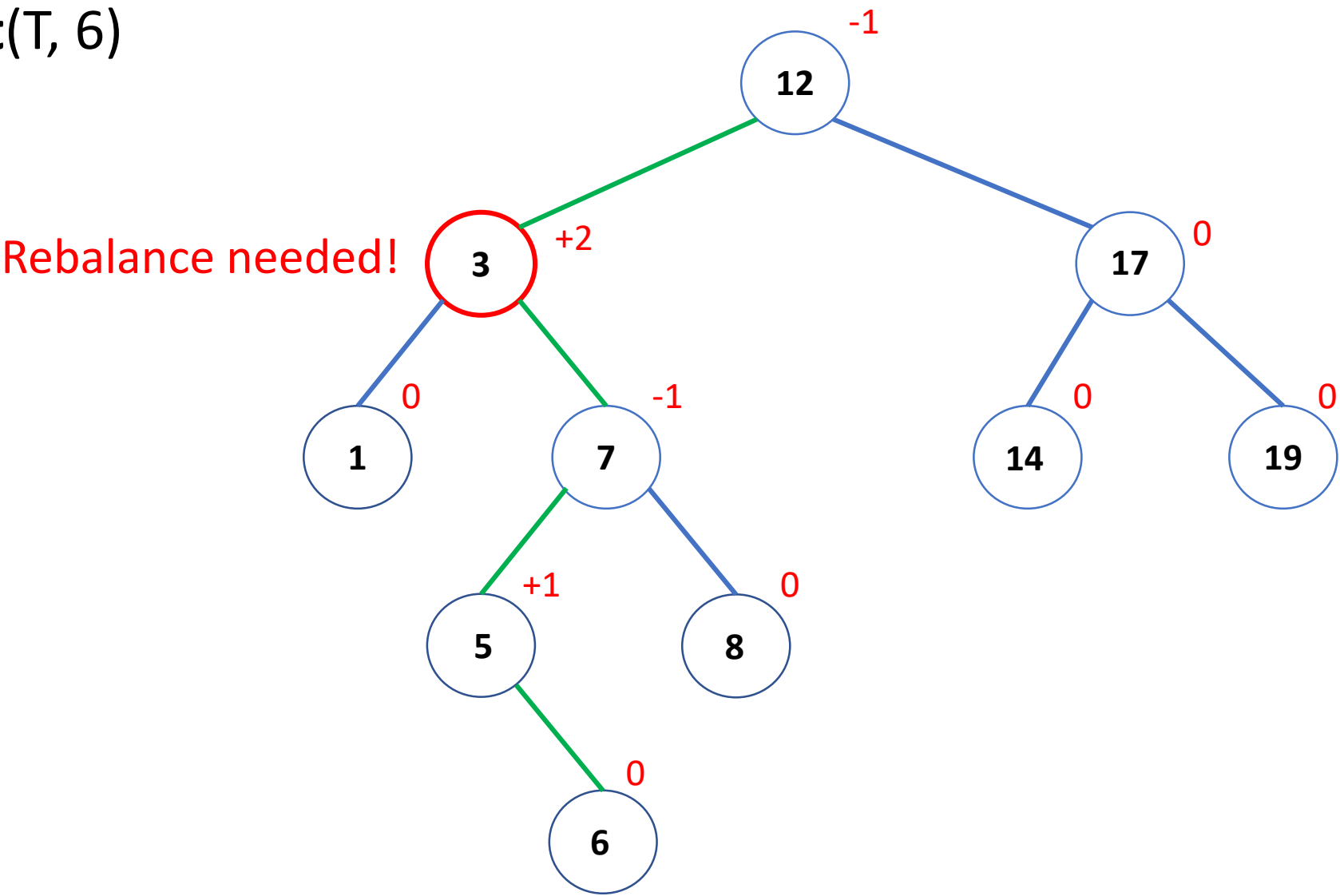
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Insert(T, 6)

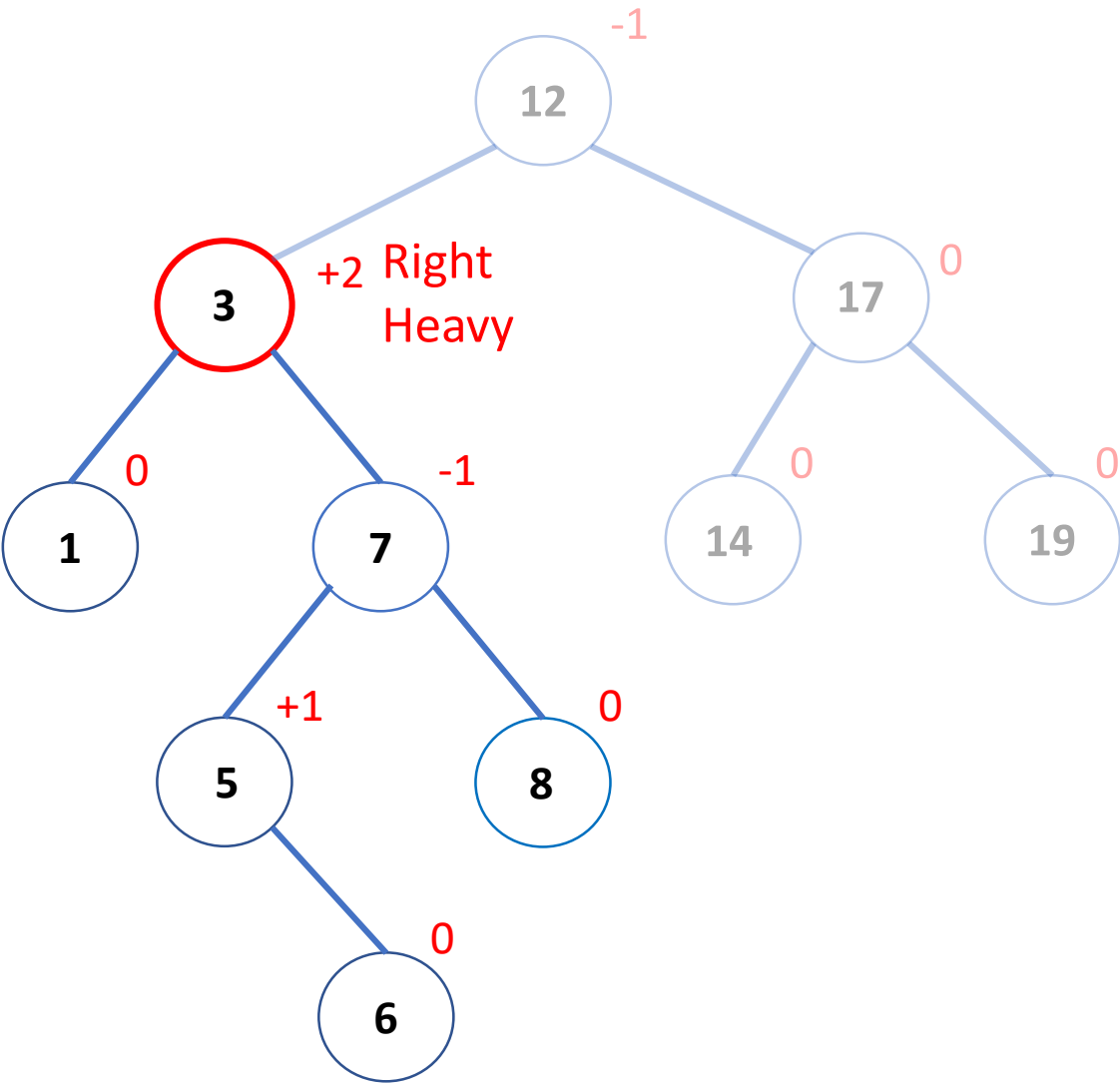


Example: AVL of {1, 3, 5, 7, 8, 12, 14, 17, 19}

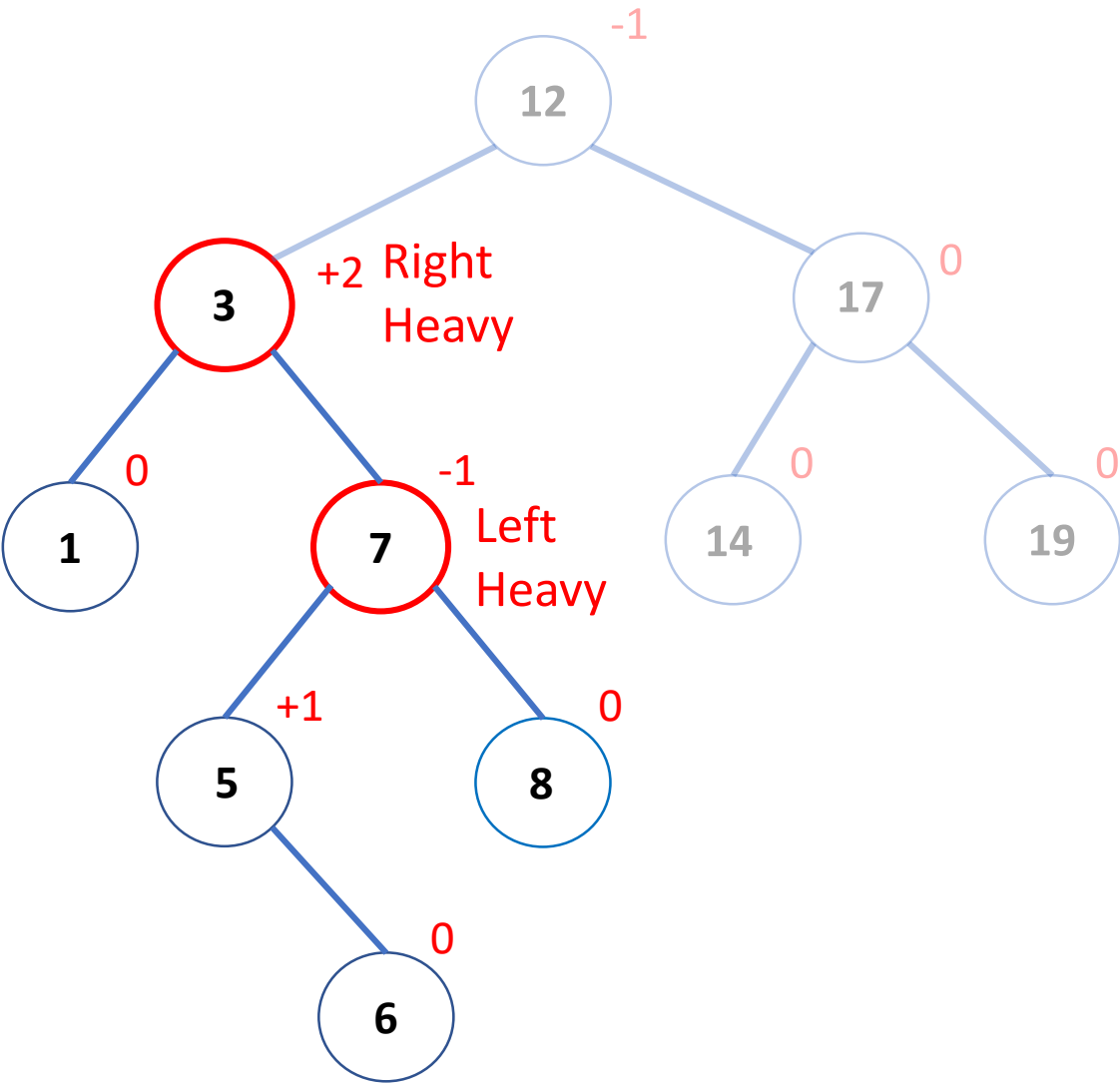
Insert(T, 6)



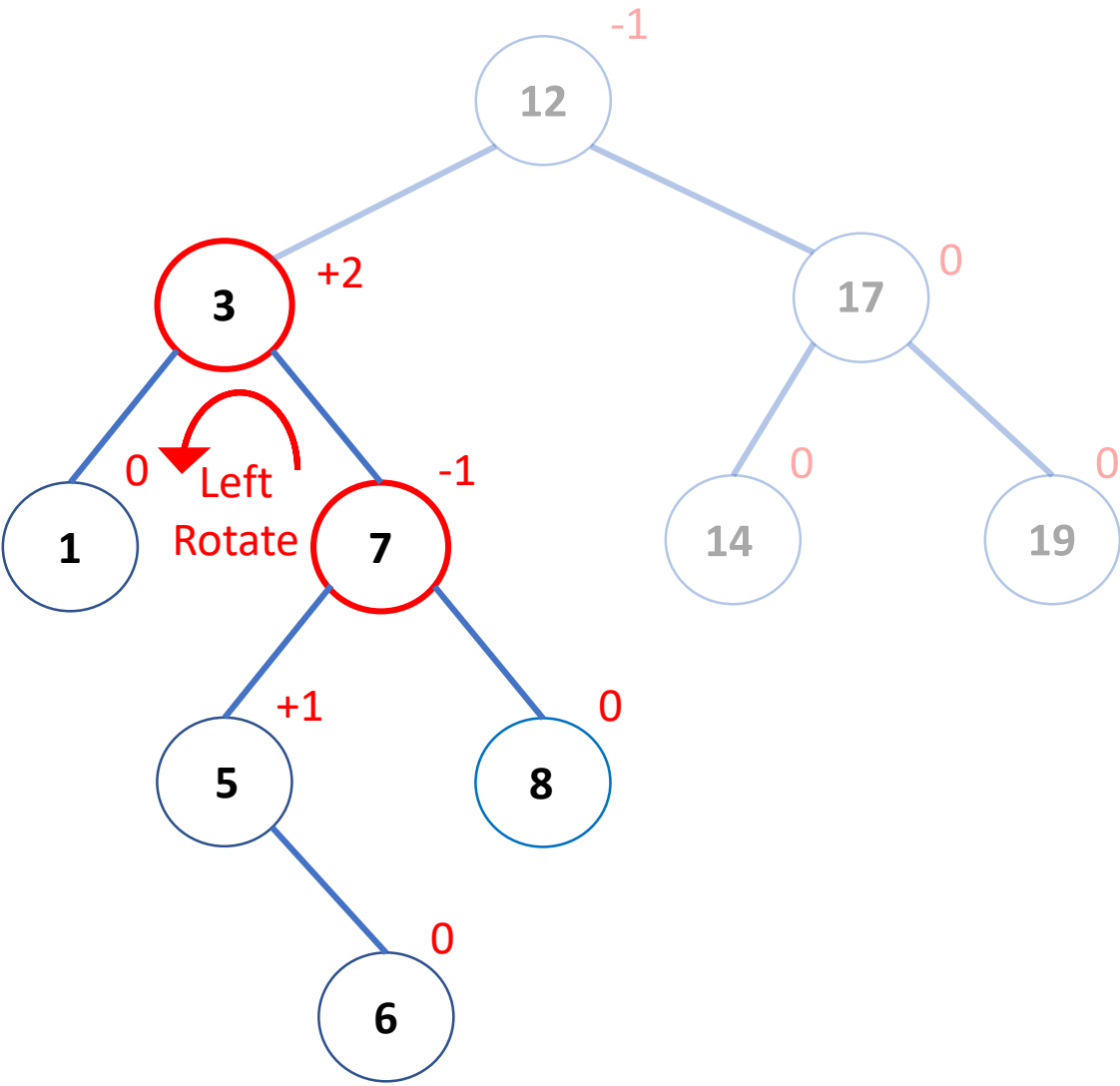
Rebalancing left subtree of 12:



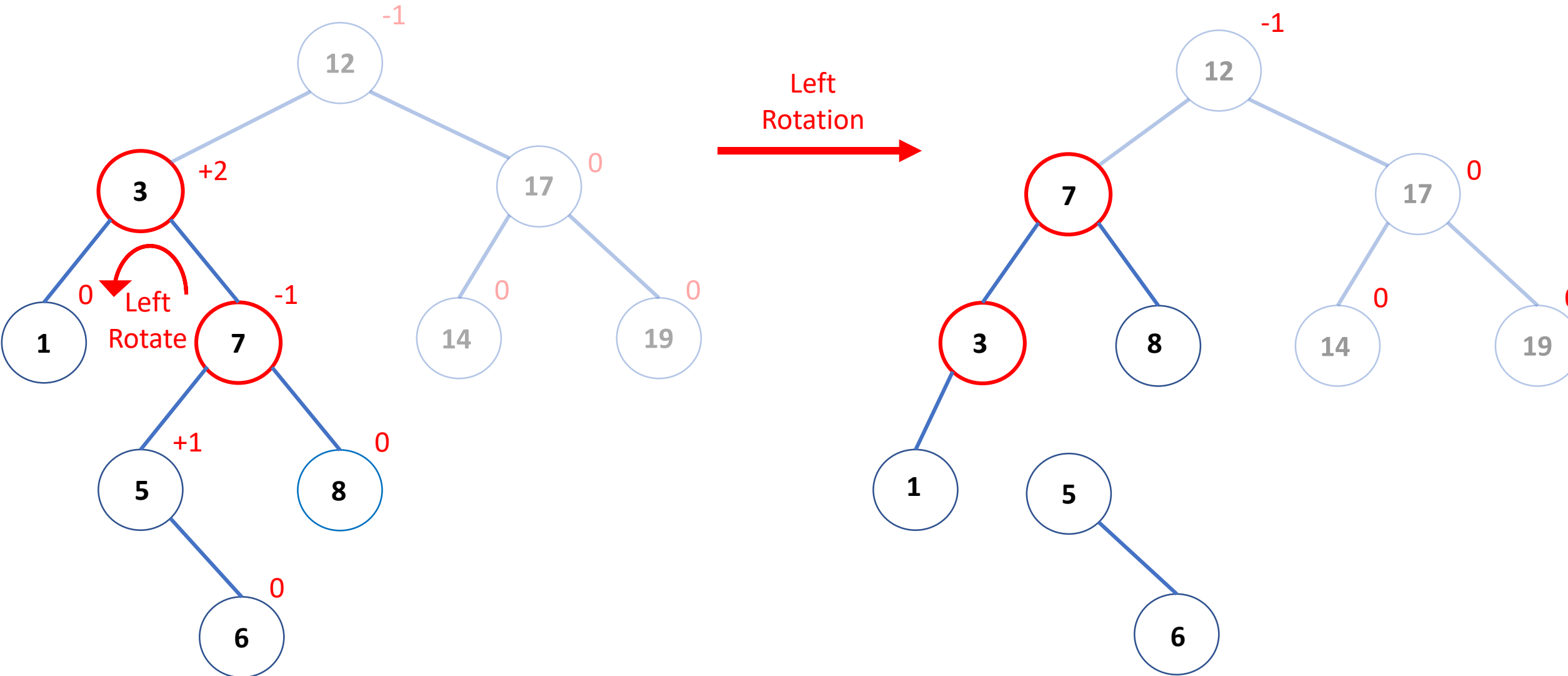
Rebalancing left subtree of 12:



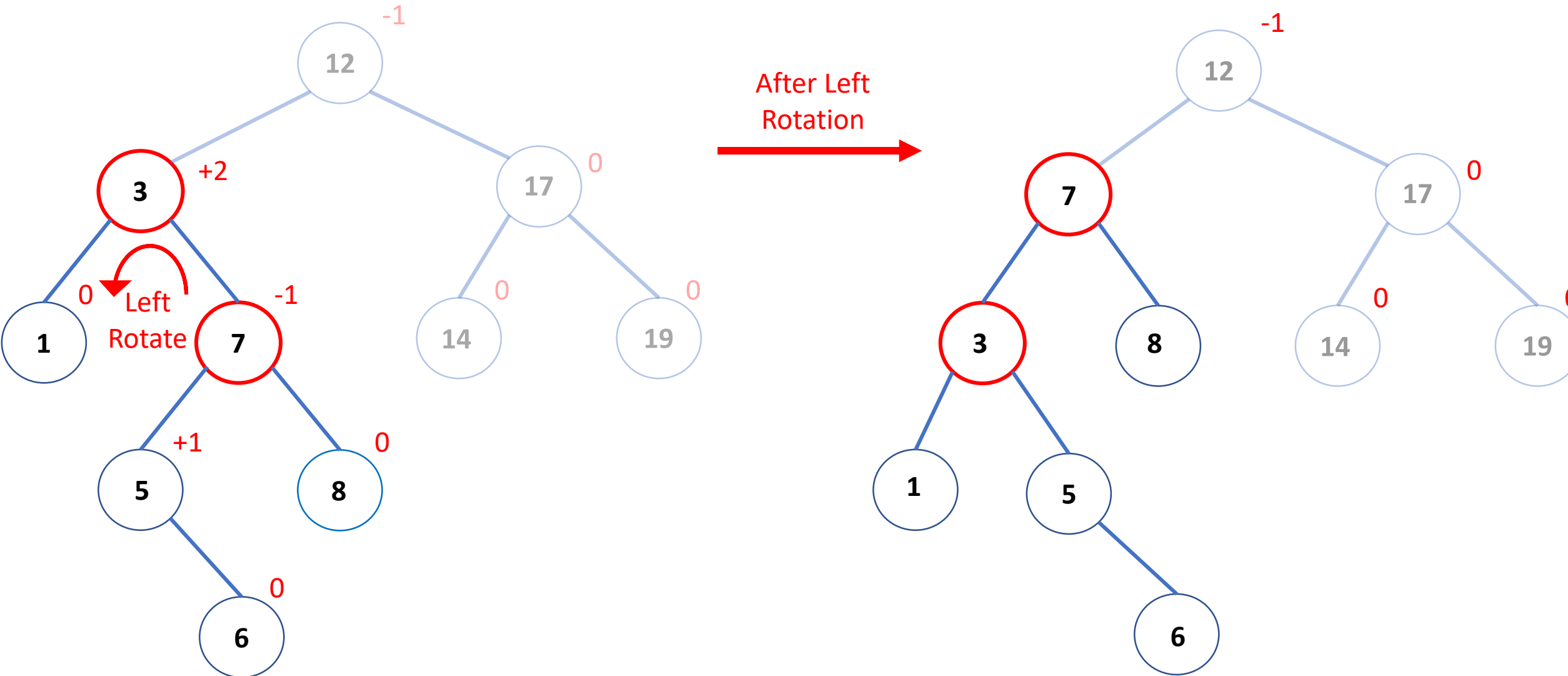
Rebalancing left subtree of 12: Try Left Rotation !



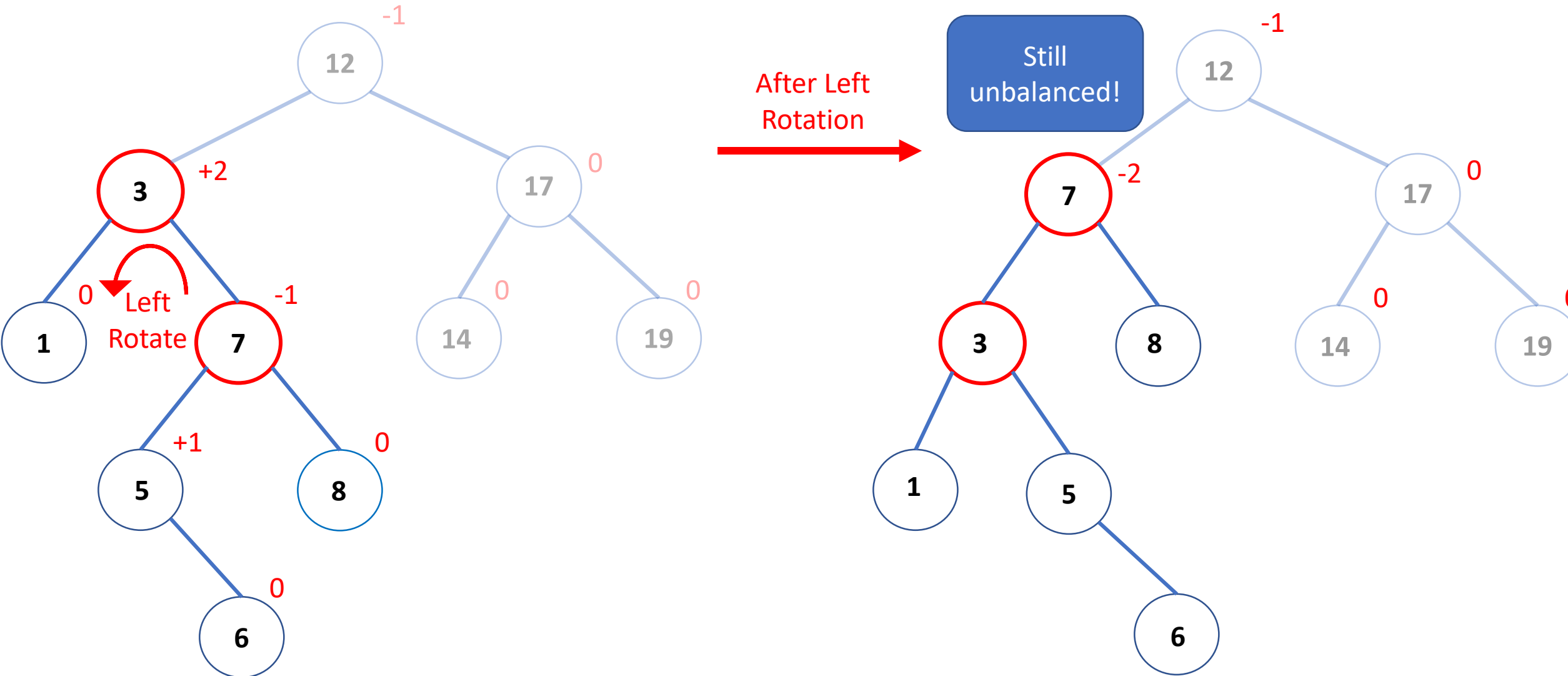
Rebalancing left subtree of 12: **Try Left Rotation !**



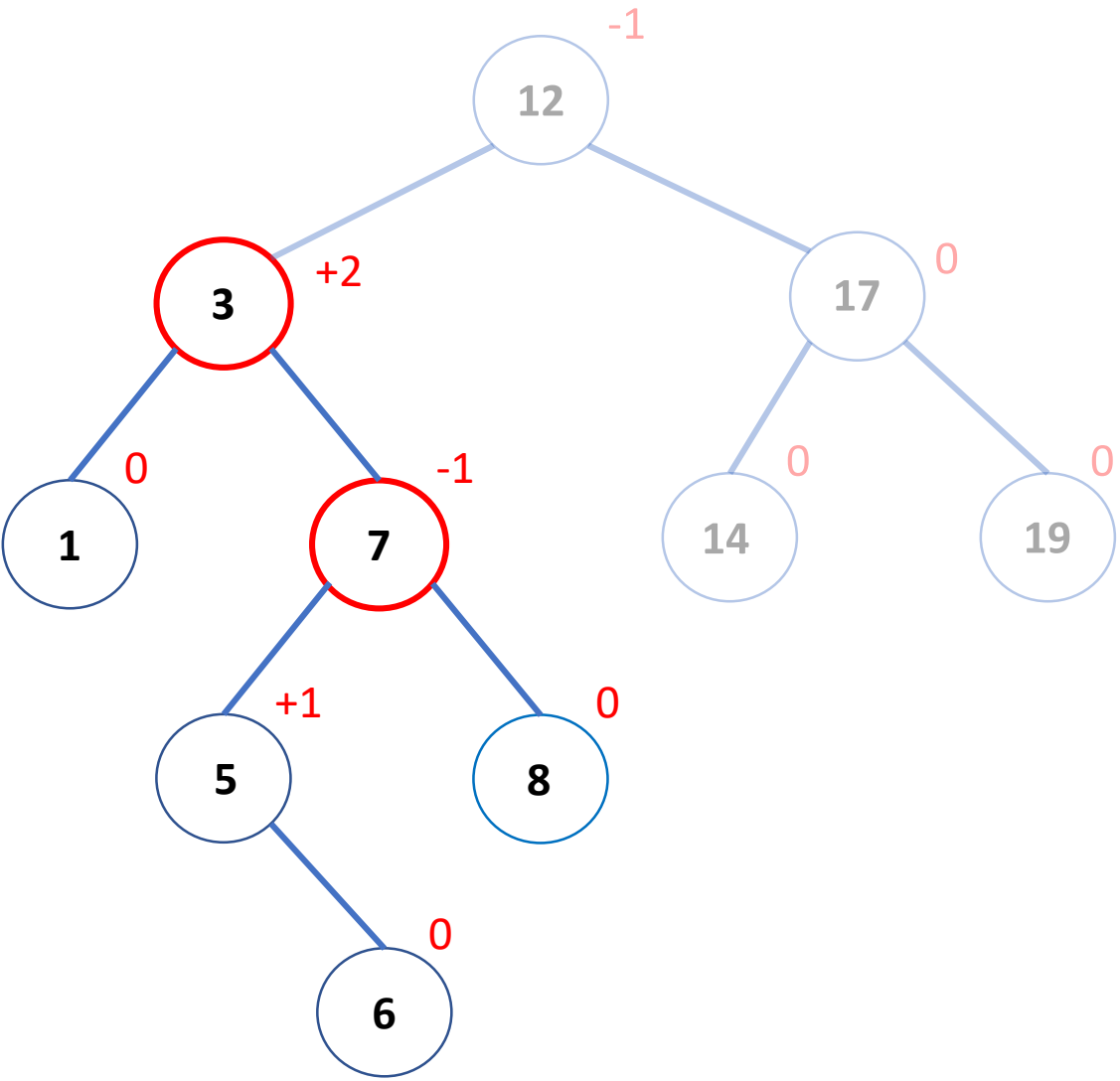
Rebalancing left subtree of 12: **Try Left Rotation !**



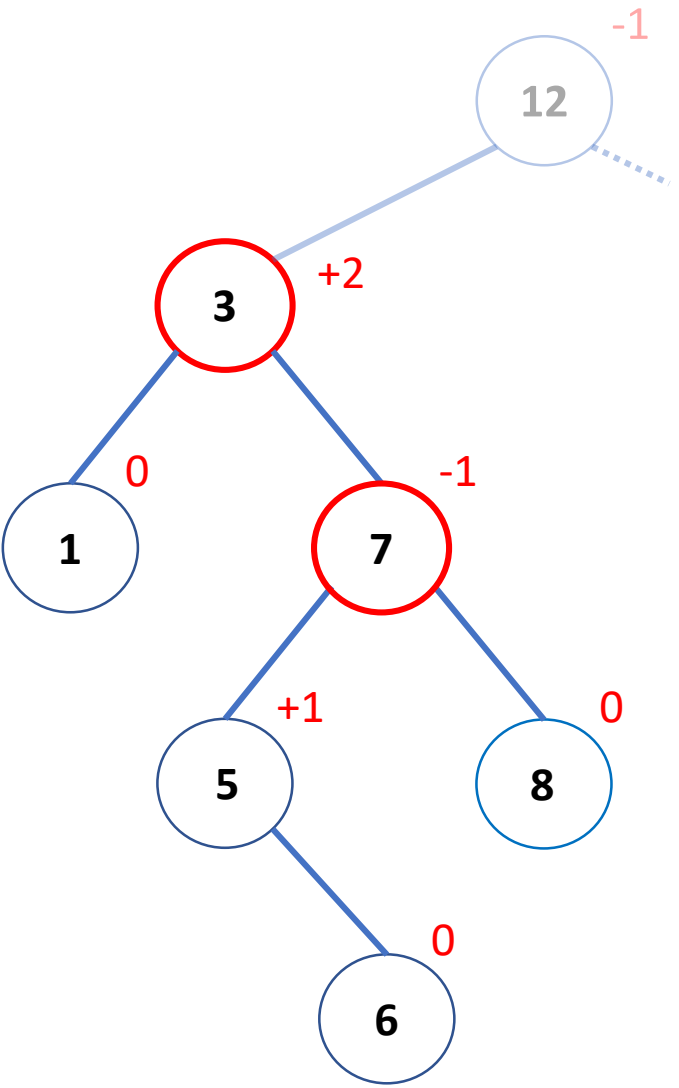
Rebalancing left subtree of 12: **Try Left Rotation !**



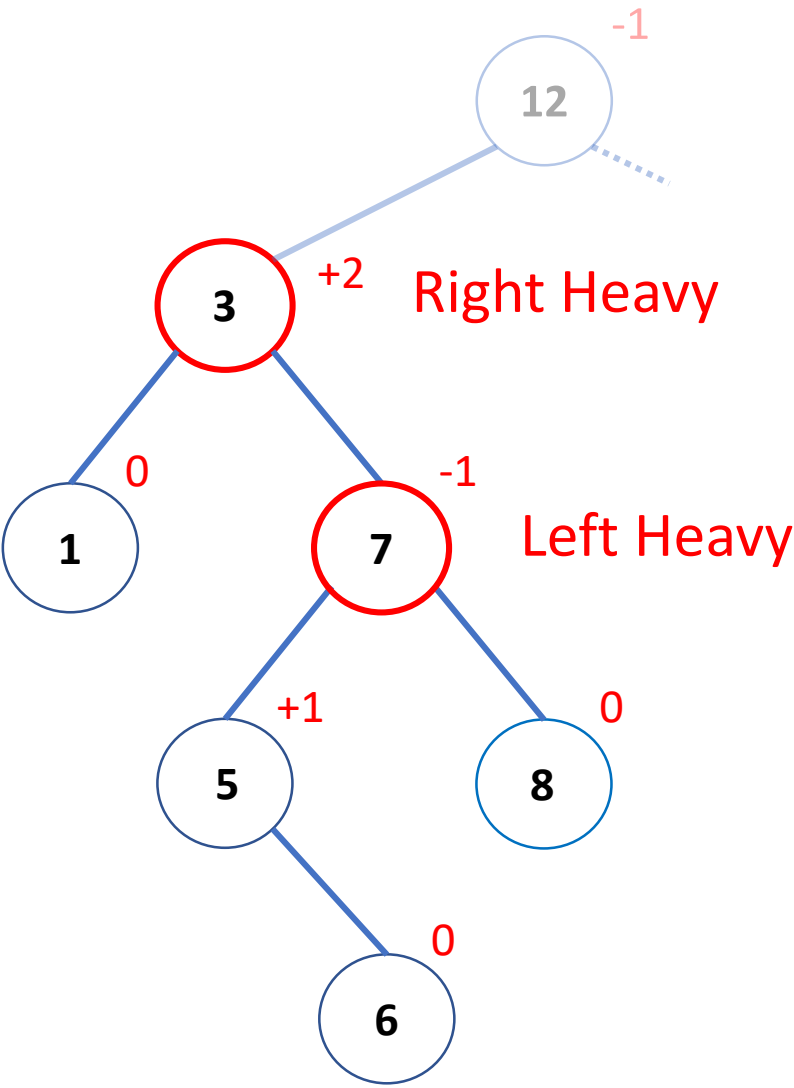
Rebalancing left subtree of 12: Attempt two!



Rebalancing left subtree of 12: Attempt two!

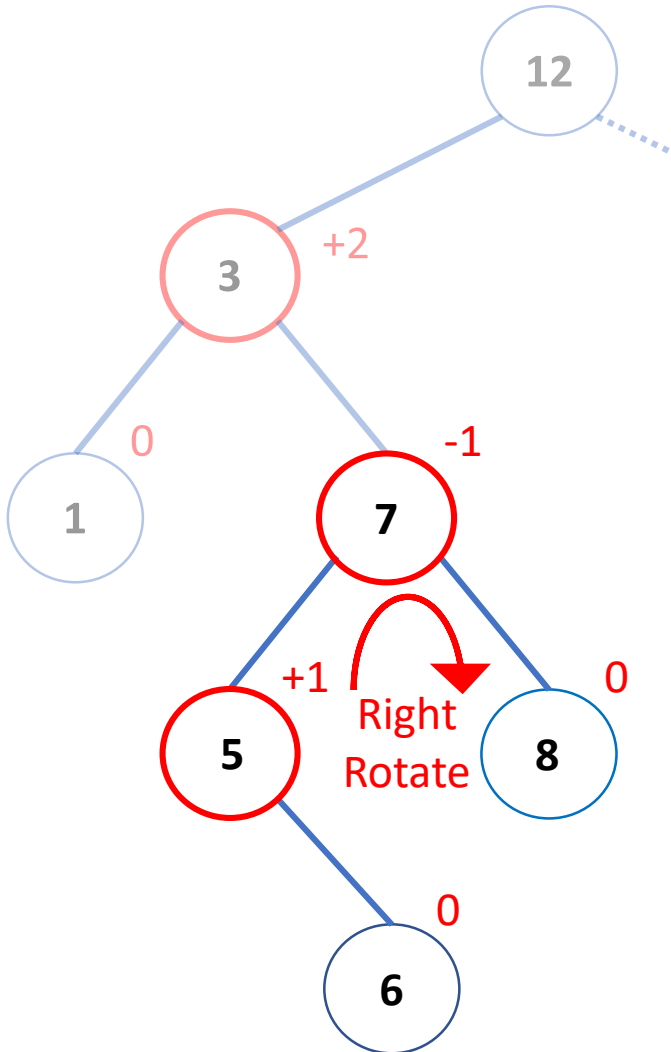


Rebalancing left subtree of 12: Attempt two!



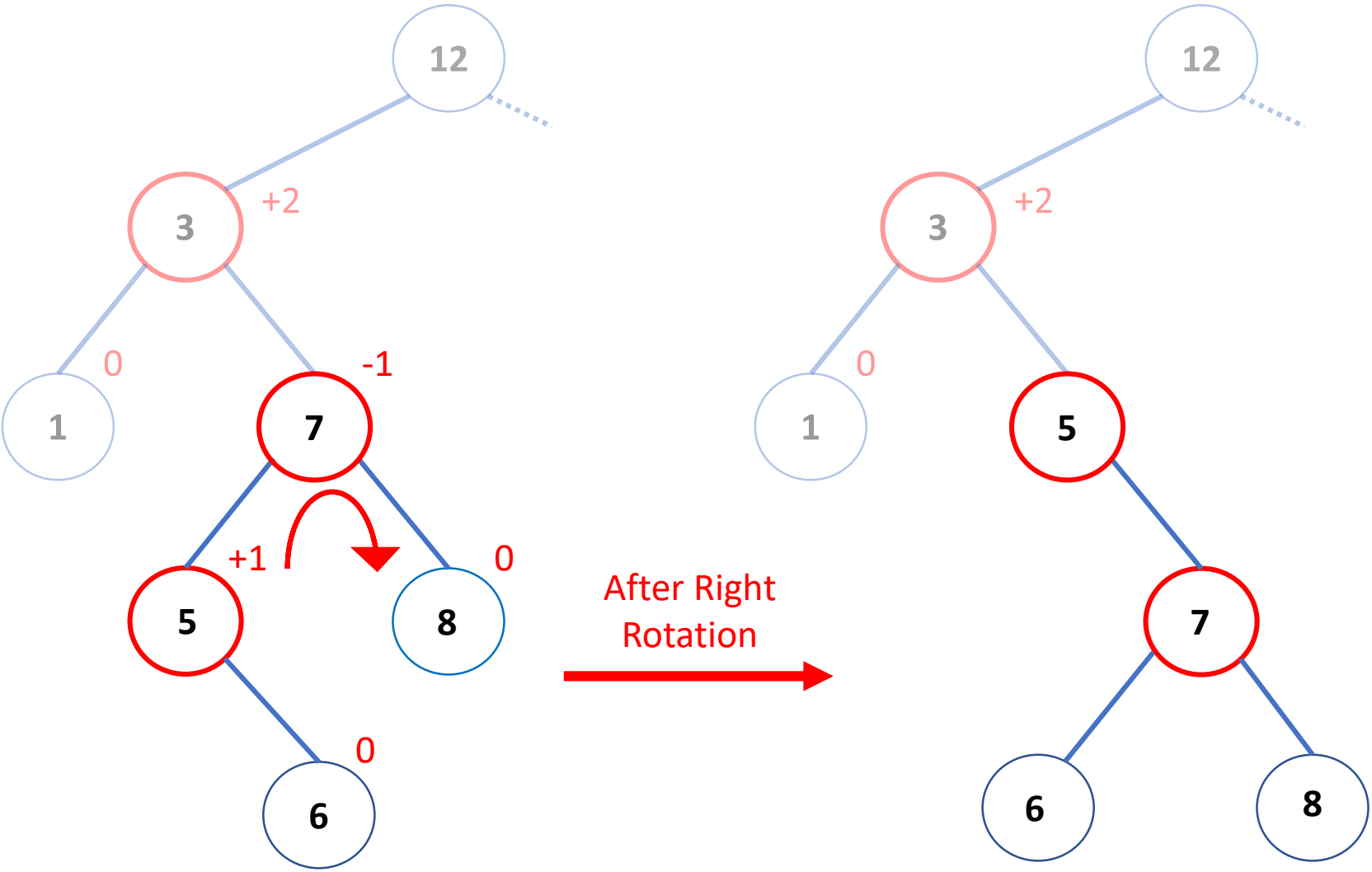
Rebalancing left subtree of 12: Attempt two!

Step 1. Right rotate right subtree of 3



Rebalancing left subtree of 12: Attempt two!

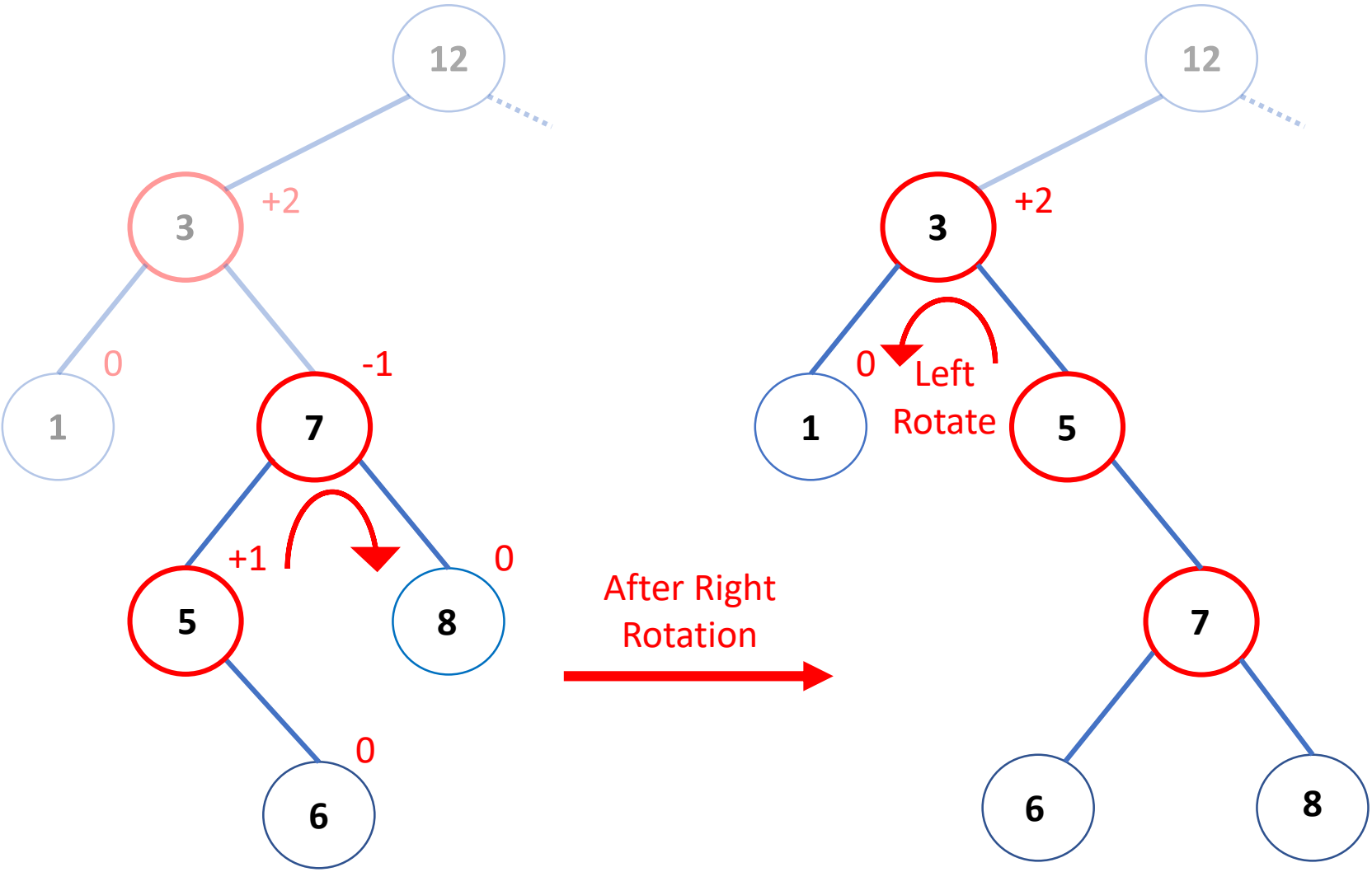
Step 1. Right rotate right subtree of 3



Rebalancing left subtree of 12: Attempt two!

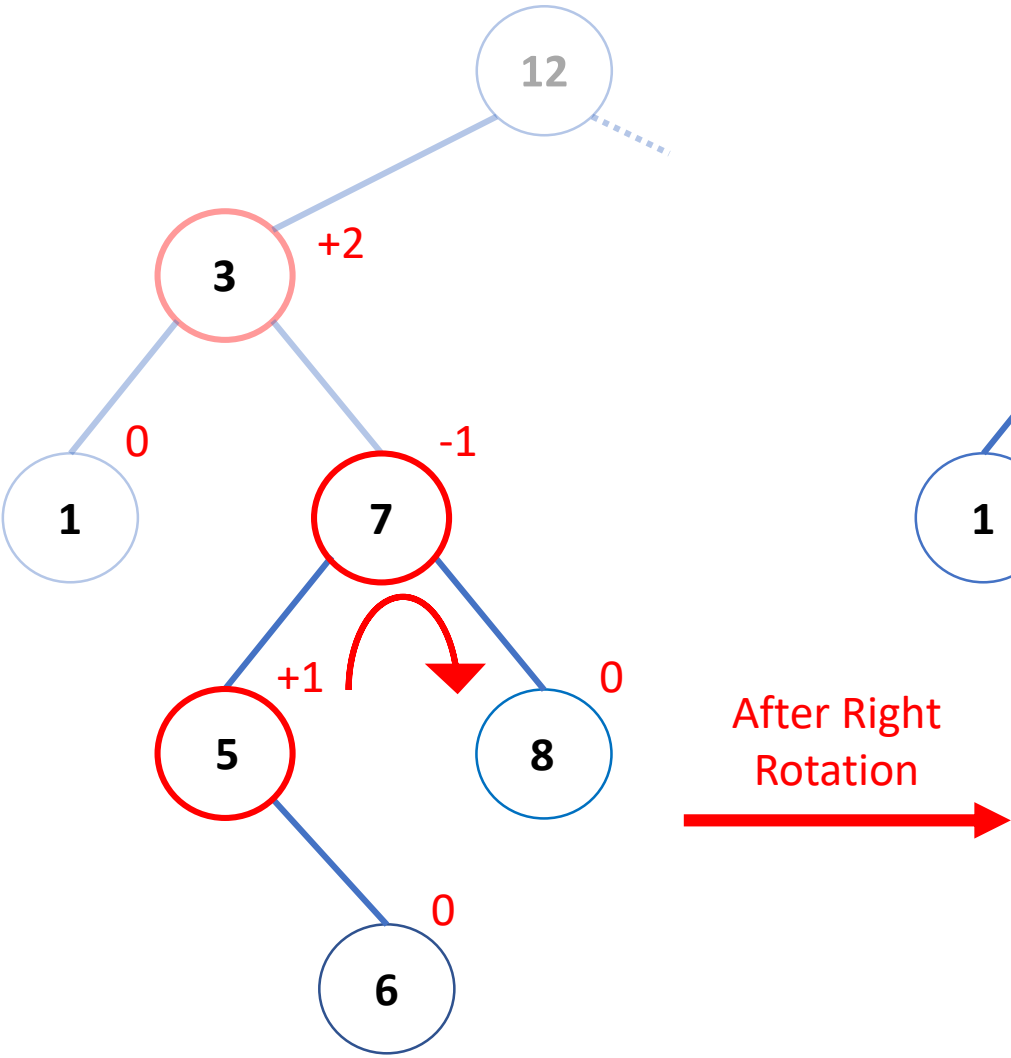
Step 1. Right rotate right subtree of 3

Step 2. Left rotate left subtree of 12

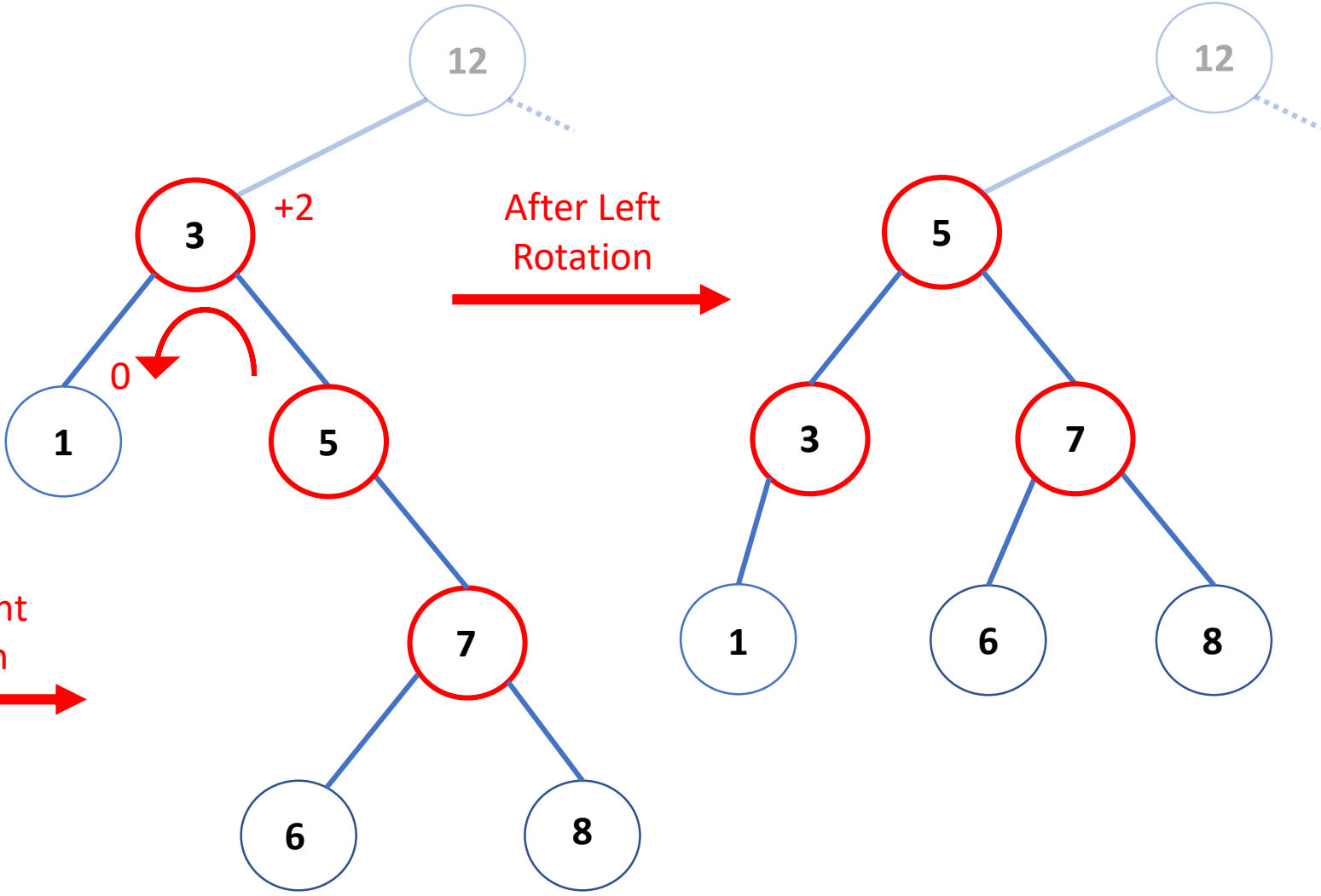


Rebalancing left subtree of 12: Attempt two!

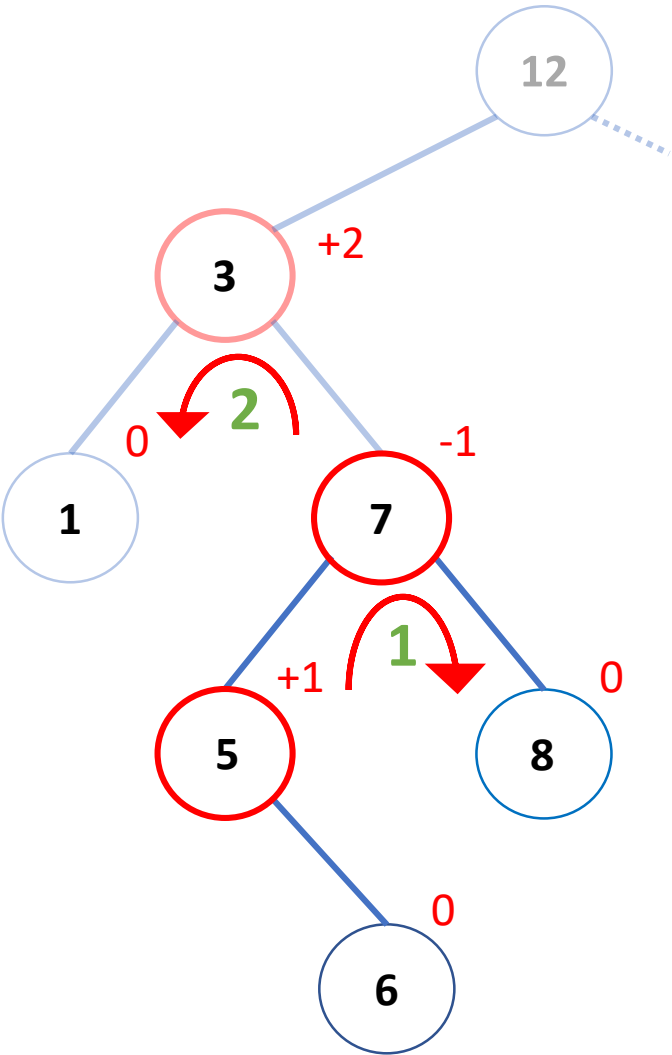
Step 1. Right rotate right subtree of 3



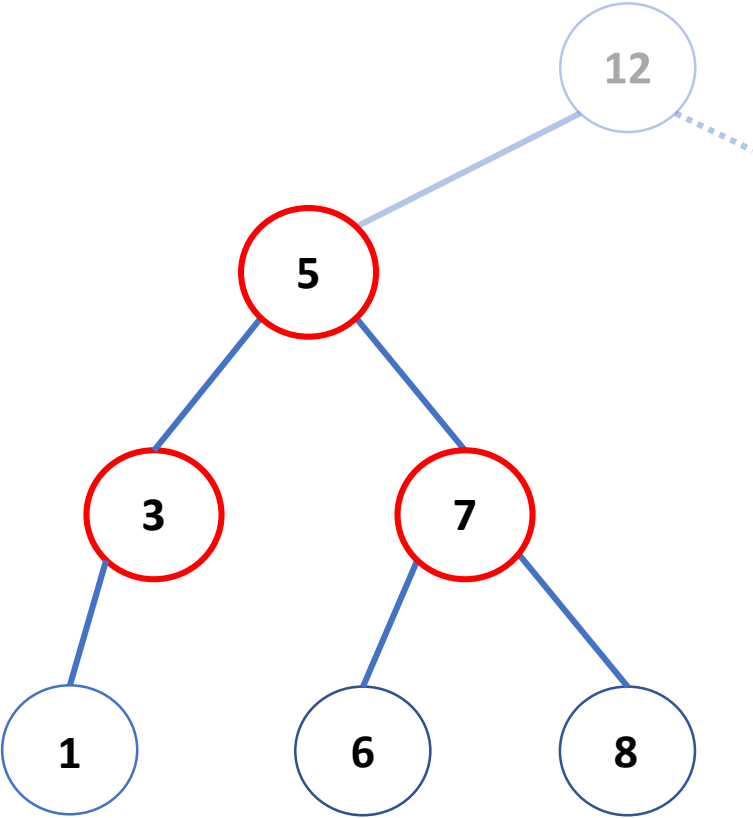
Step 2. Left rotate left subtree of 12



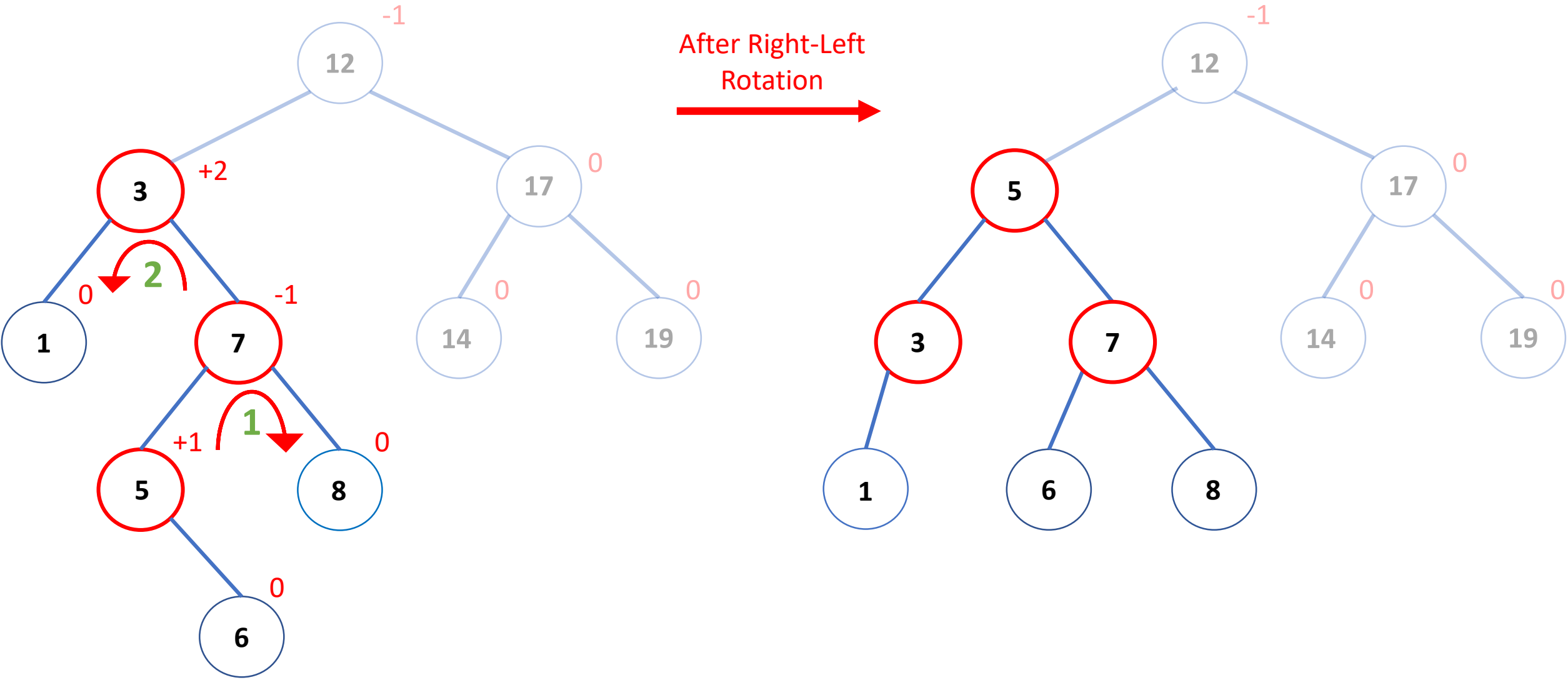
Rebalancing left subtree of 12: Double Right-Left Rotation



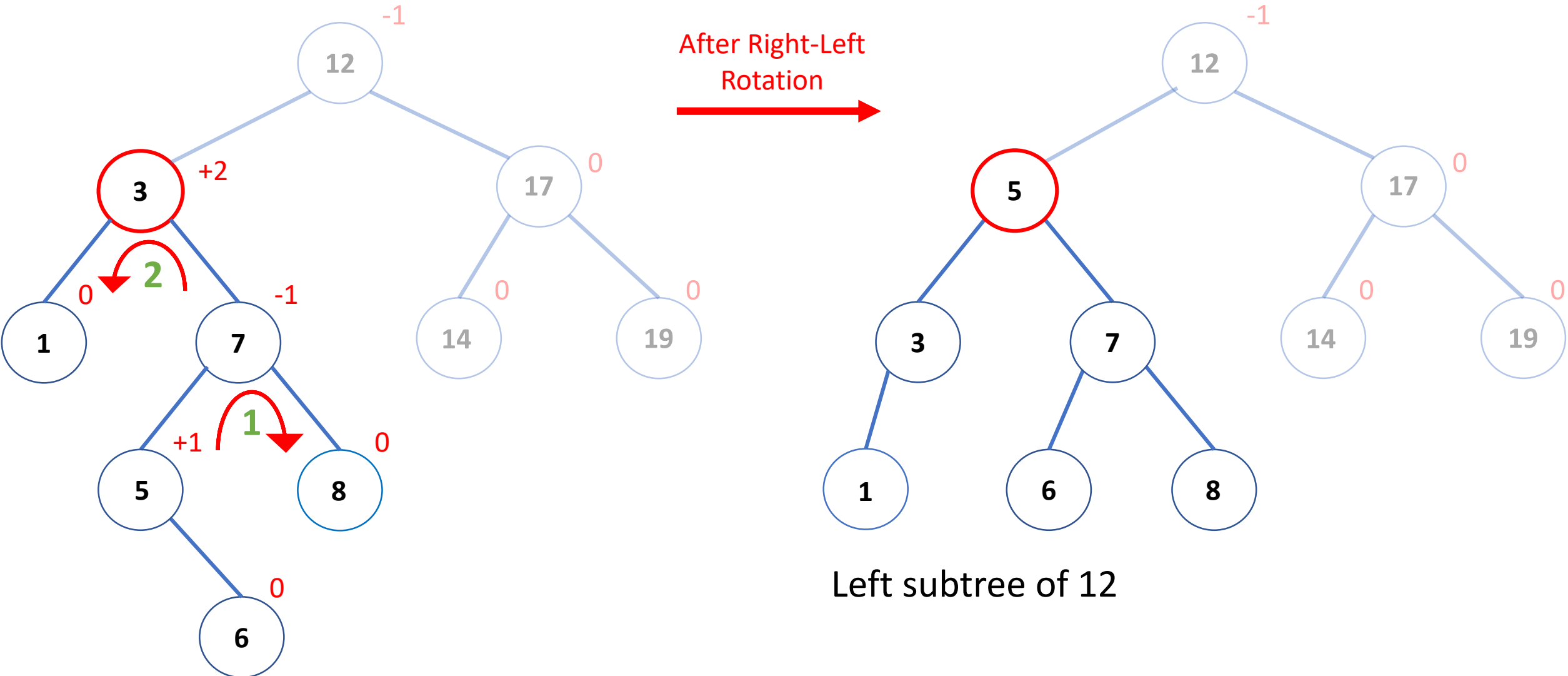
After Right-Left
Rotation



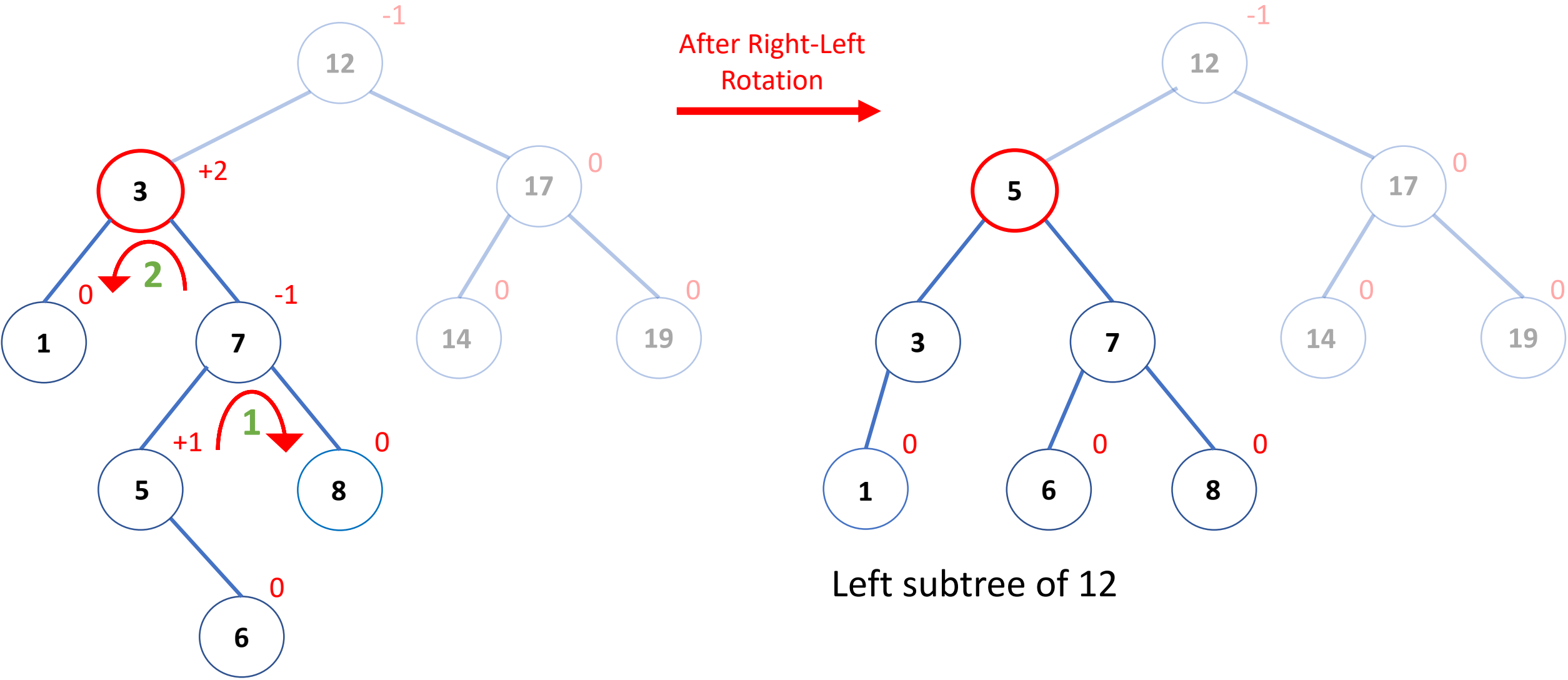
Rebalancing left subtree of 12: Double Right-Left Rotation



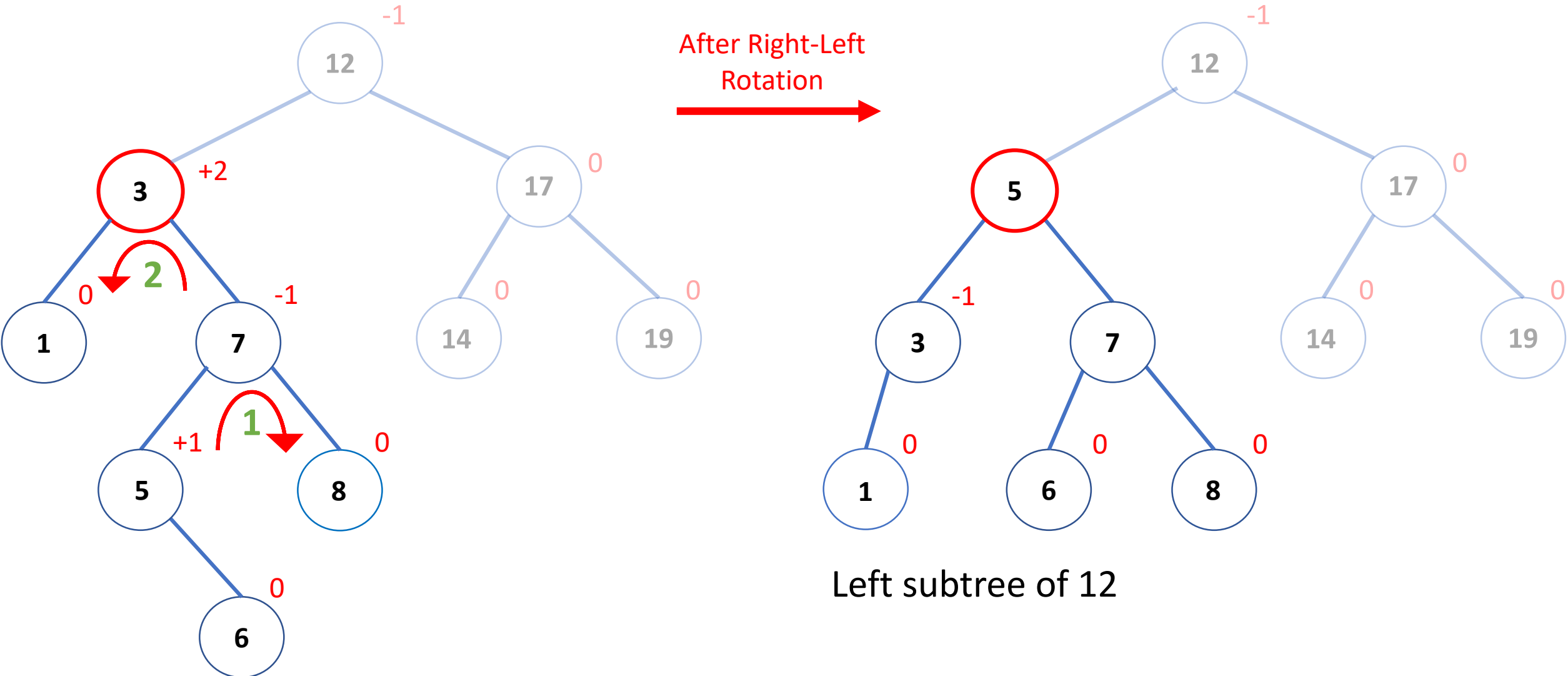
Rebalancing left subtree of 12: Double Right-Left Rotation



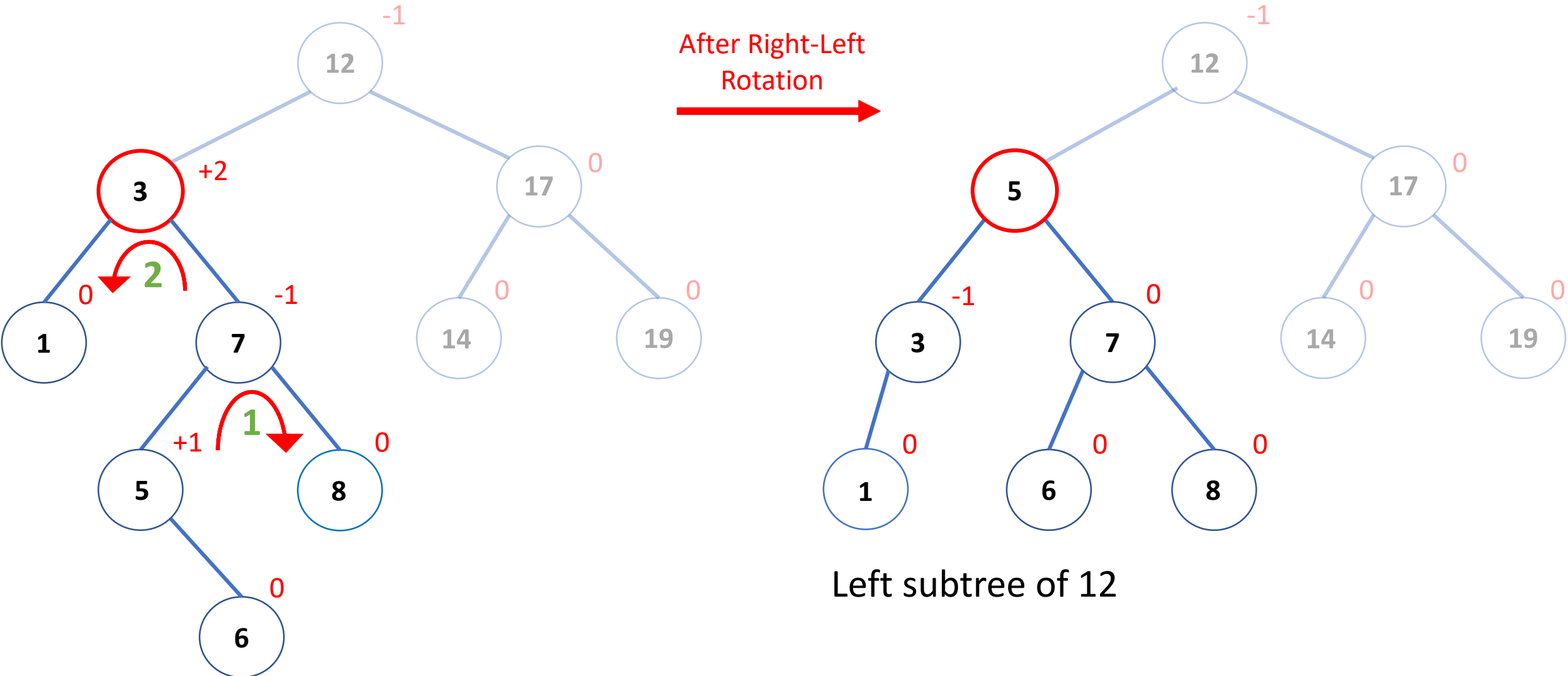
Rebalancing left subtree of 12: Double Right-Left Rotation



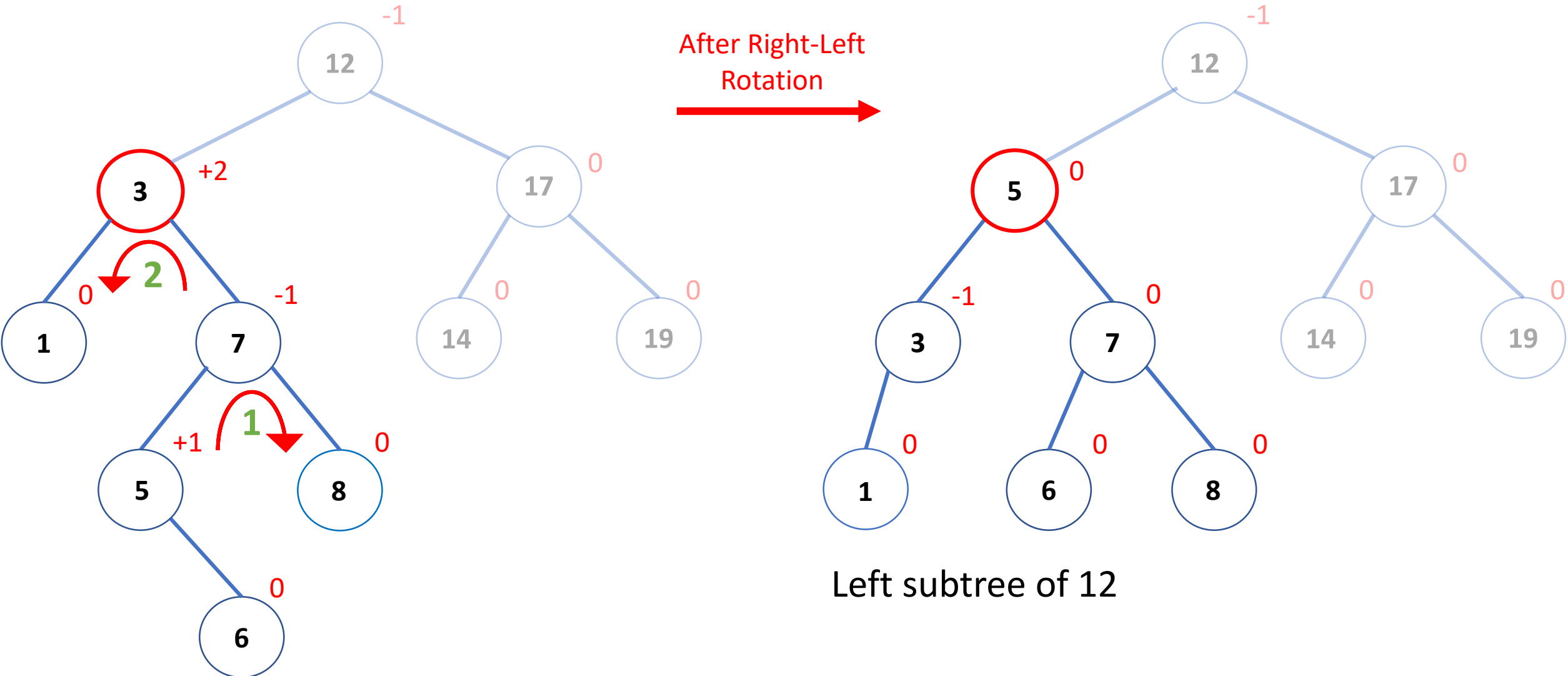
Rebalancing left subtree of 12: Double Right-Left Rotation



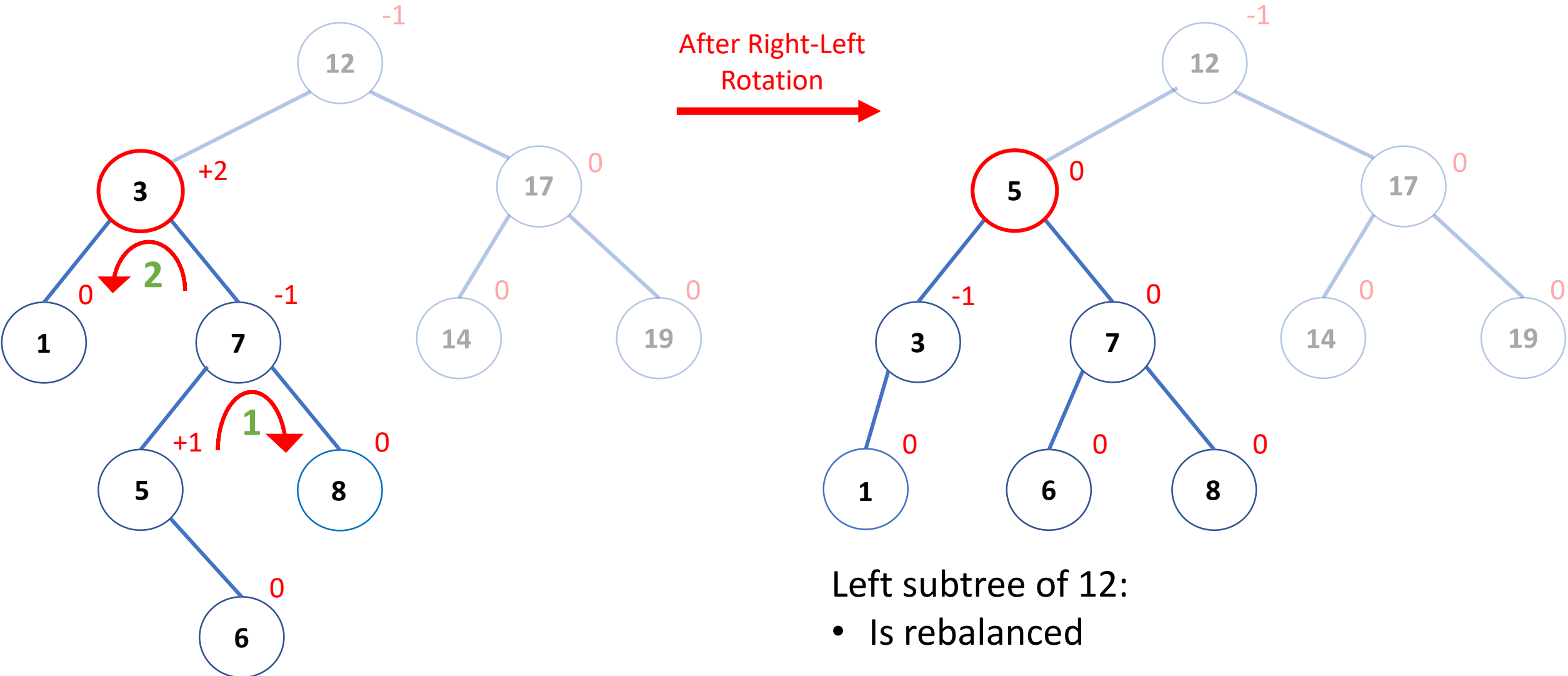
Rebalancing left subtree of 12: Double Right-Left Rotation



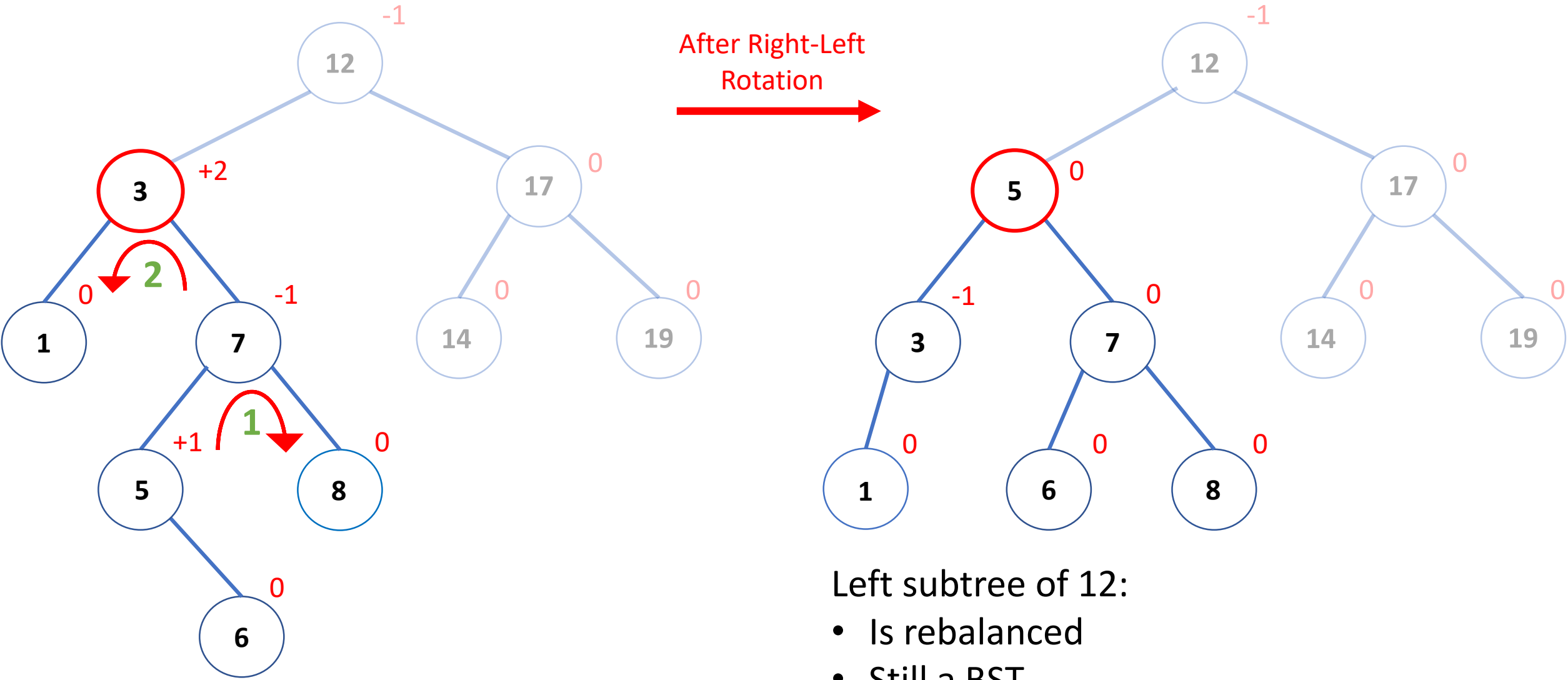
Rebalancing left subtree of 12: Double Right-Left Rotation



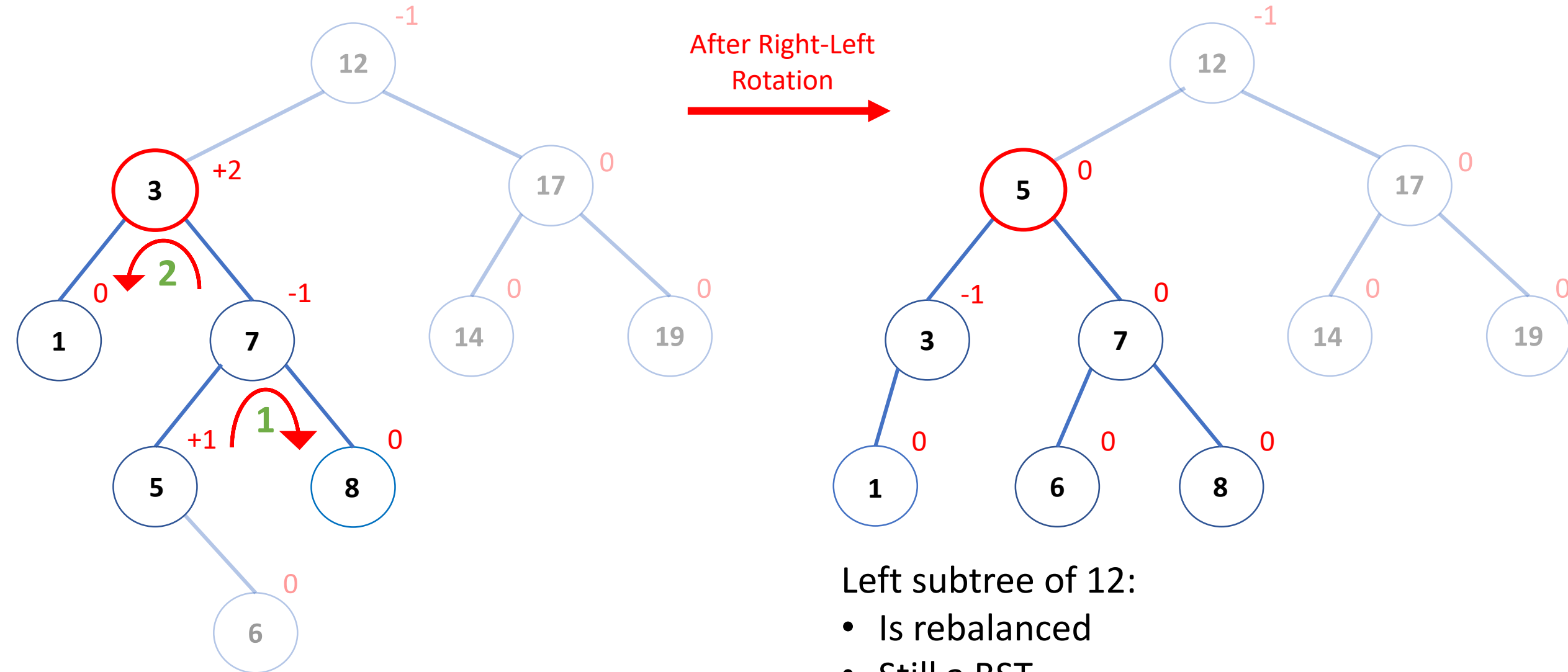
Rebalancing left subtree of 12: Double Right-Left Rotation



Rebalancing left subtree of 12: Double Right-Left Rotation



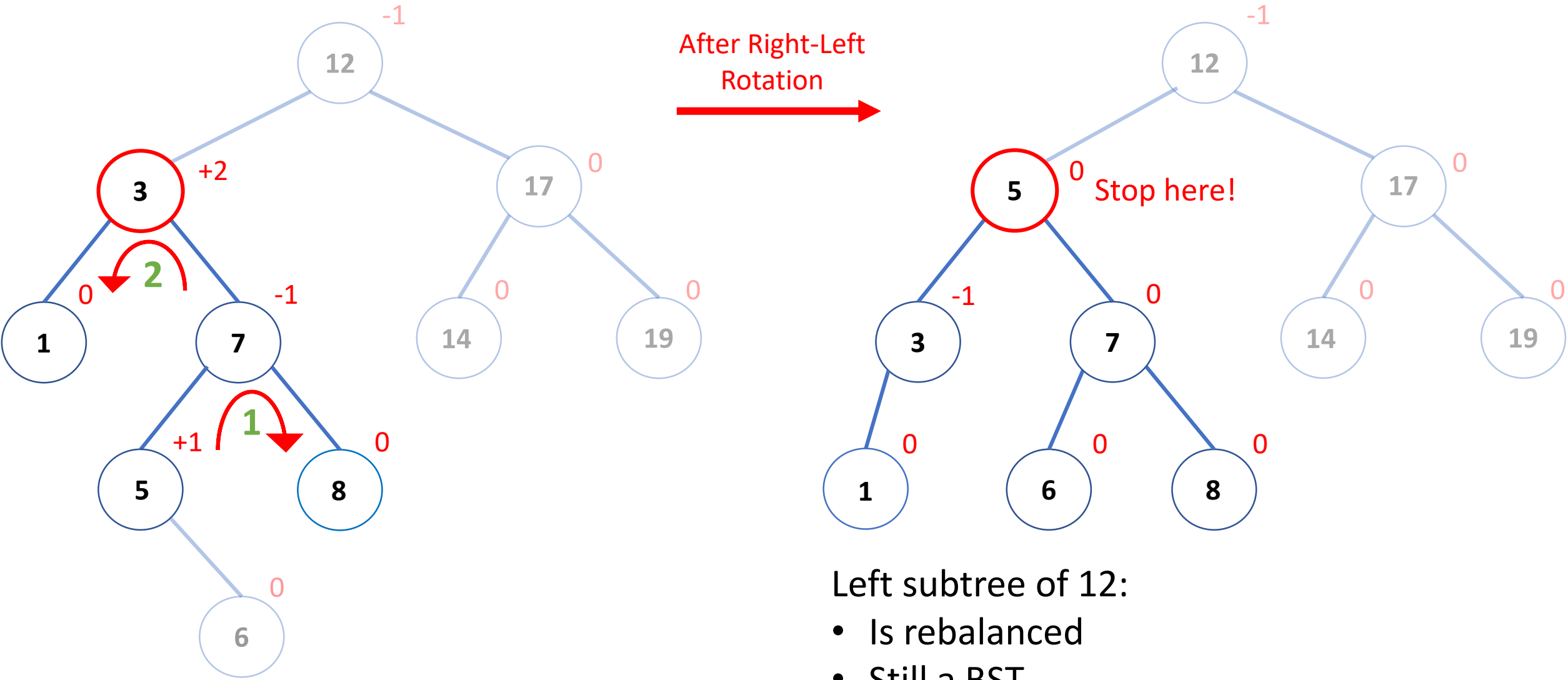
Rebalancing left subtree of 12: Double Right-Left Rotation



Left subtree of 12:

- Is rebalanced
- Still a BST
- **Bonus:** height same as before inserting 6

Rebalancing left subtree of 12: Double Right-Left Rotation



Left subtree of 12:

- Is rebalanced
- Still a BST
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