



CSE 332: Data Structures & Parallelism

Lecture 8: AVL Trees

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Autumn 2016

Today

- Dictionaries
 - AVL Trees

The AVL Balance Condition:

Left and right subtrees of *every node* have heights differing by at most 1

Define: **balance**(x) = $\text{height}(x.\text{left}) - \text{height}(x.\text{right})$

AVL property: $-1 \leq \text{balance}(x) \leq 1$, for every node x

- Ensures small depth
 - Will prove this by showing that an AVL tree of height h must have a lot of (*roughly* 2^h) nodes
- Easy to maintain
 - Using single and double rotations

$$\log(N) = (2^h)$$
$$\log_2 N = h$$

Note: height of a null tree is -1, height of tree with a single node is 0

The AVL Tree Data Structure

Structural properties

1. Binary tree property
(0,1, or 2 children)

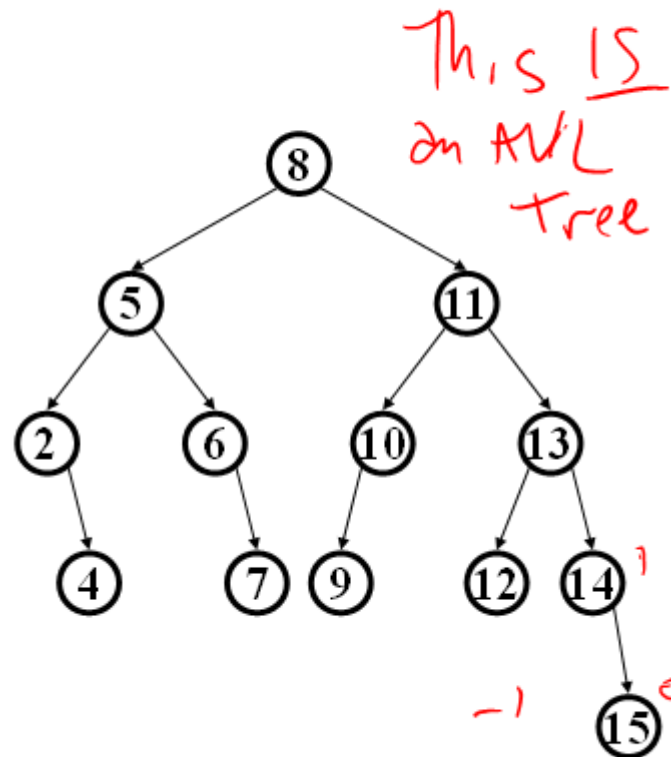
2. Heights of left and right subtrees of every node differ by at most 1

Result:

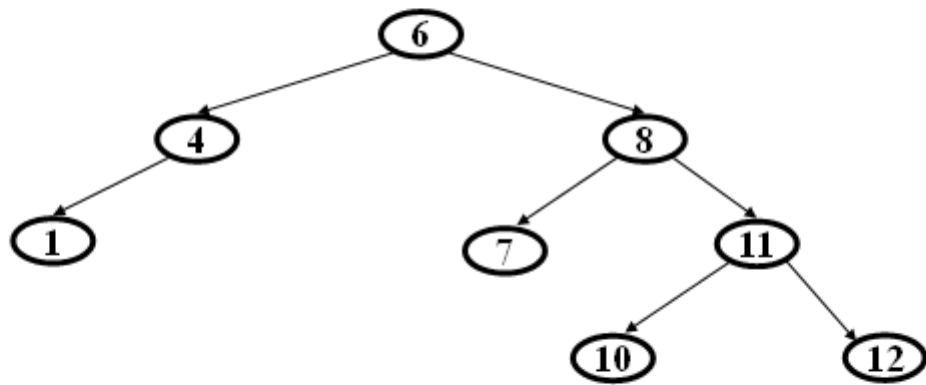
Worst case depth of any node is: $O(\log n)$

Ordering property

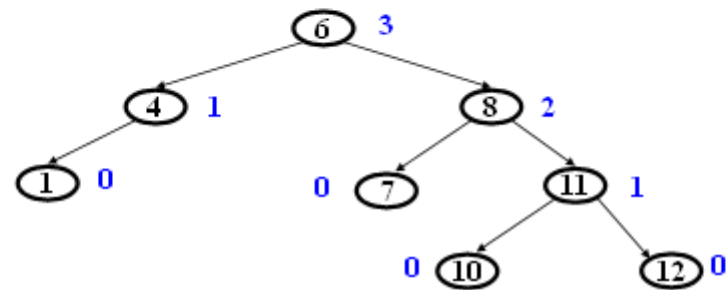
- Same as for BST



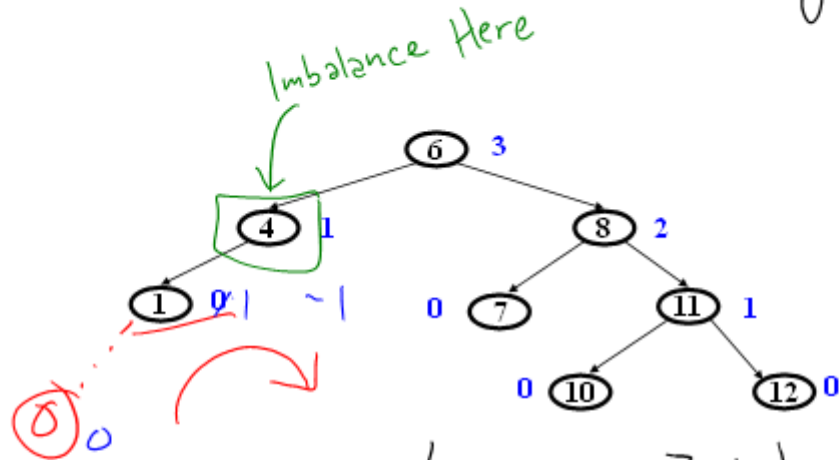
Ex1: An AVL tree?



EX1: An AVL tree? Yes

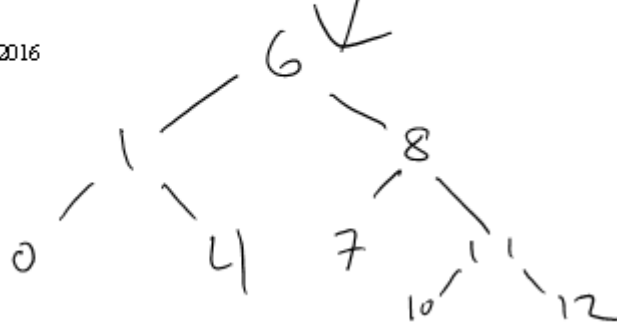


EX1: An AVL tree? (After Inserting 0?) No

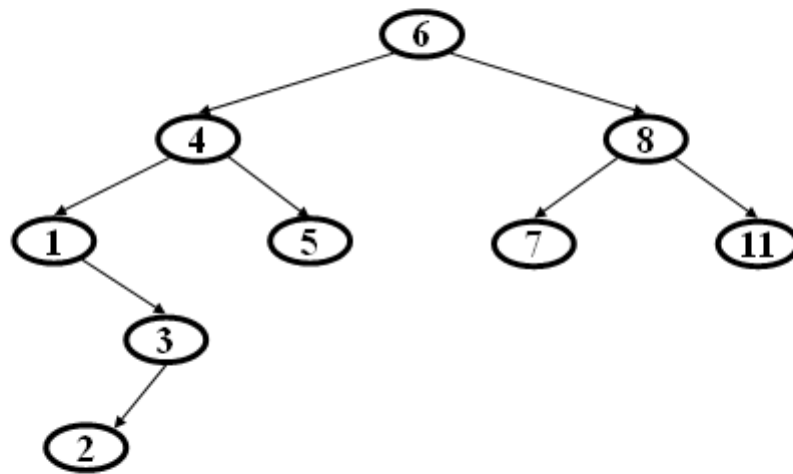


Single Rotation (Rotate Between Self + child)
(see slide #28)
(a case #1)
see slide 24

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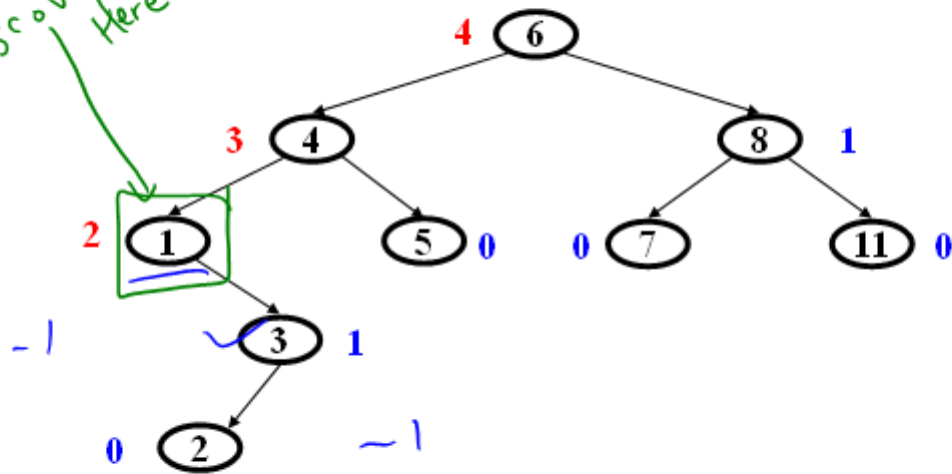


Ex2: An AVL tree?

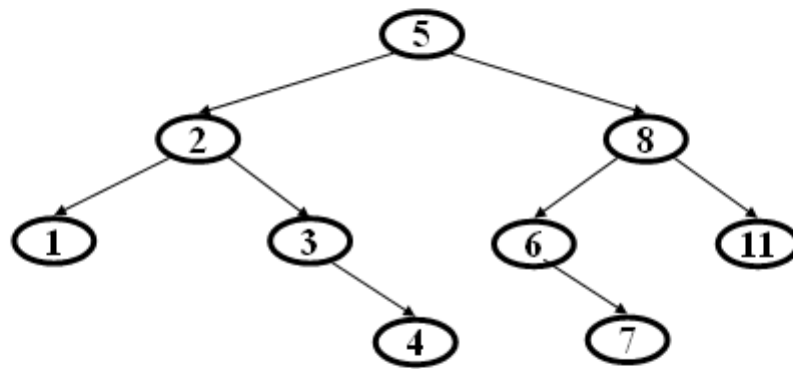


Ex2: An AVL tree? *No*

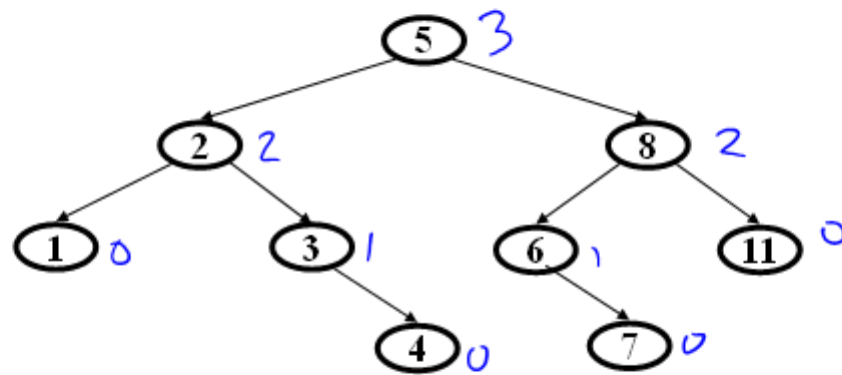
*Imbalance
Discovered
Here*



Ex3: An AVL tree?

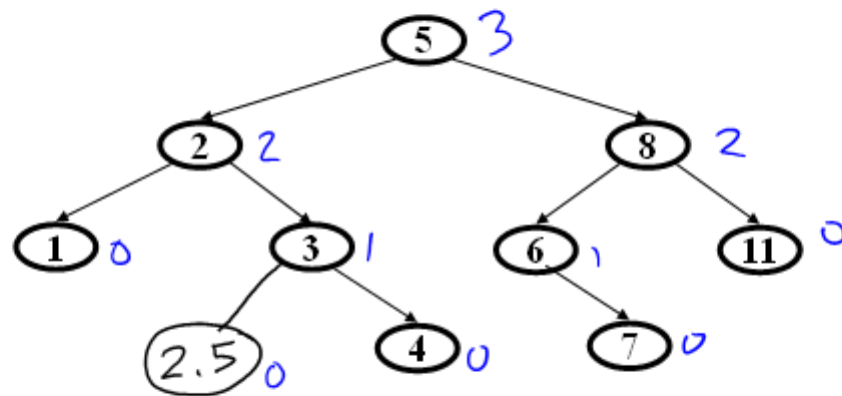


Ex3: An AVL tree? Yes



Ex3: An AVL tree? (After Inserting 2.5?)

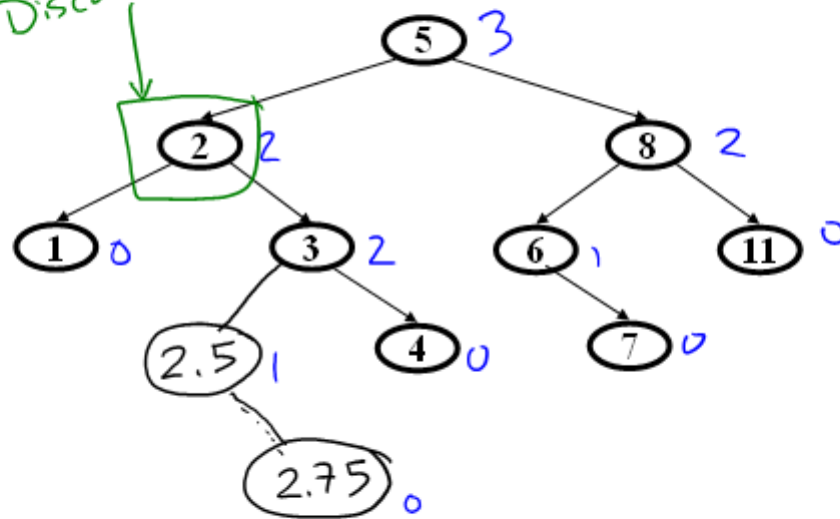
Yes



Ex3: An AVL tree? (After inserting 2.75 ?)

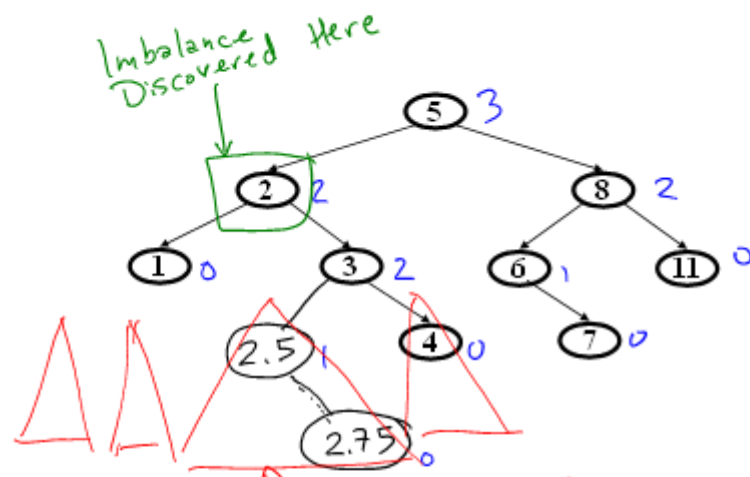
No

Imbalance
Discovered
Here



Ex3: An AVL tree? (After inserting 2.75 ?)

No

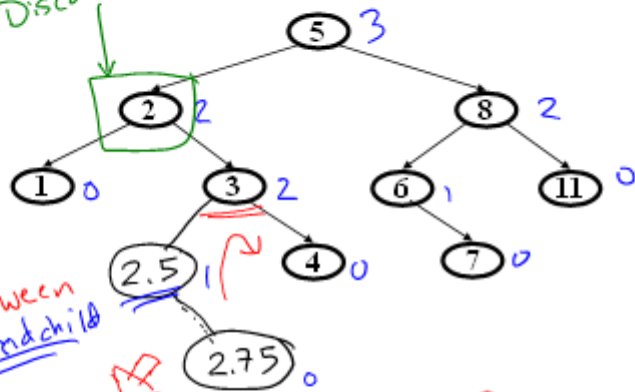


A "case 3", fix with a double rotation
(See slide #24)

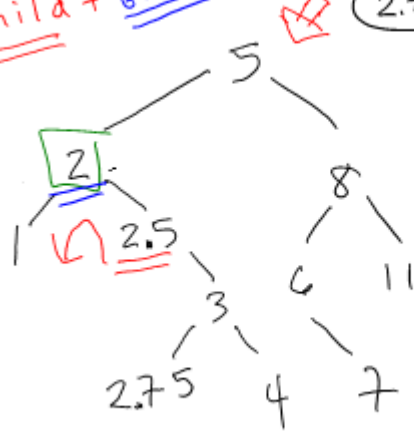
Ex3: An AVL tree? (After inserting 2.75 ?)

No

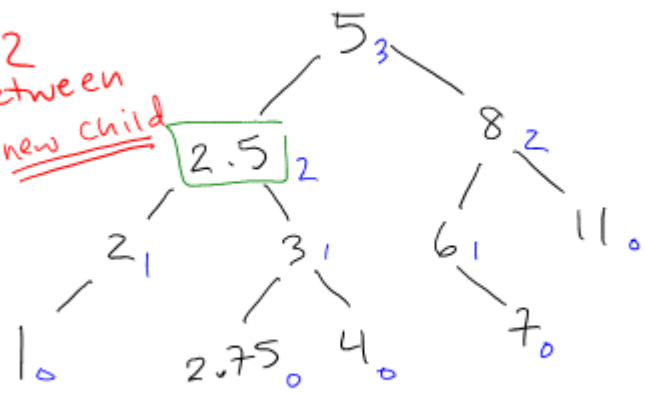
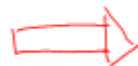
Imbalance
Discovered Here



Step #1
Rotate Between
Child + Grandchild



Step #2
Rotate Between
self + new child



Height of an AVL Tree?

Using the AVL balance property, we can determine the minimum number of nodes in an AVL tree of height h

Let $\mathbf{s}(h)$ be the minimum # of nodes in an AVL tree of height h , then:

$$\mathbf{s}(h) = \mathbf{s}(h-1) + \mathbf{s}(h-2) + 1$$




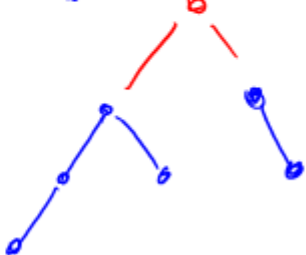
where $\mathbf{s}(-1) = 0$ and $\mathbf{s}(0) = 1$

Solution of Recurrence: $\mathbf{s}(h) \approx 1.62^h$

Let $s(h)$ be the minimum # of nodes in an AVL tree of height h , then:

$$s(h) = s(h-1) + s(h-2) + 1$$

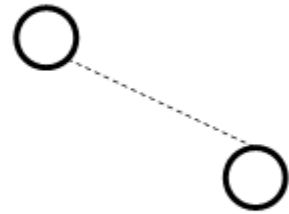
where $s(-1)=0$ and $s(0)=1$

| <u>h</u> | <u>Min height Tree</u> | <u>$s(h)$</u> |
|-----------------------|--|--------------------------|
| 0 |  | 1 |
| 1 |  | 2 |
| 2 |  | 4 |
| 3 |  | 7 |

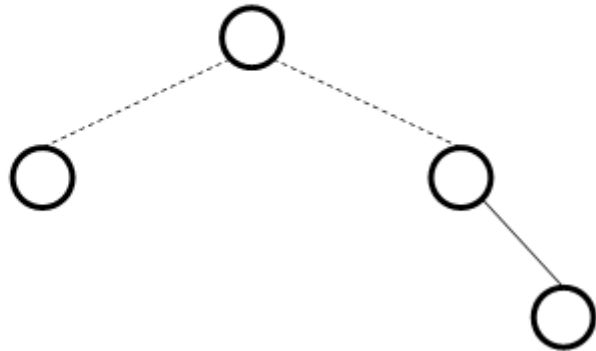
Minimal AVL Tree (height = 0)



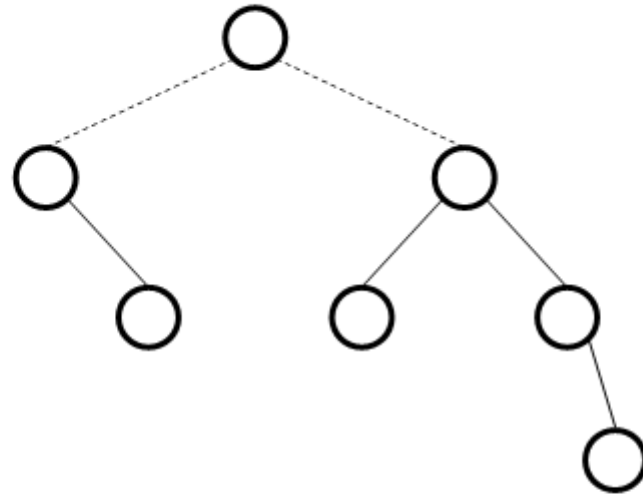
Minimal AVL Tree (height = 1)



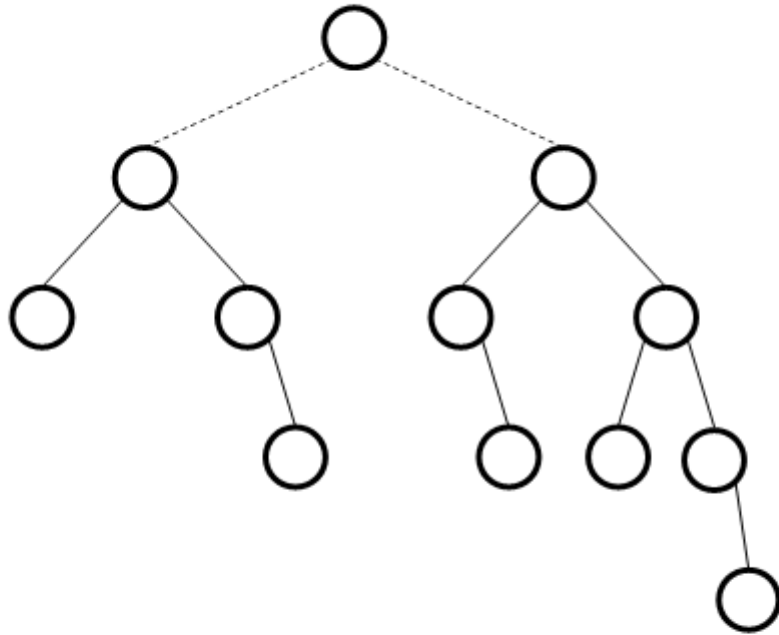
Minimal AVL Tree (height = 2)



Minimal AVL Tree (height = 3)



Minimal AVL Tree (height = 4)



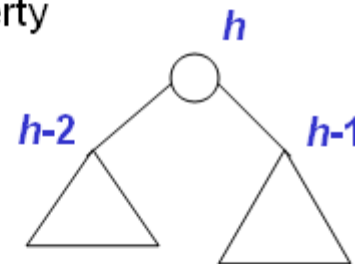
The shallowness bound

Let $S(h)$ = the minimum number of nodes in an AVL tree of height h

- If we can prove that $S(h)$ grows exponentially in h , then a tree with n nodes has a logarithmic height

- Step 1: Define $S(h)$ inductively using AVL property

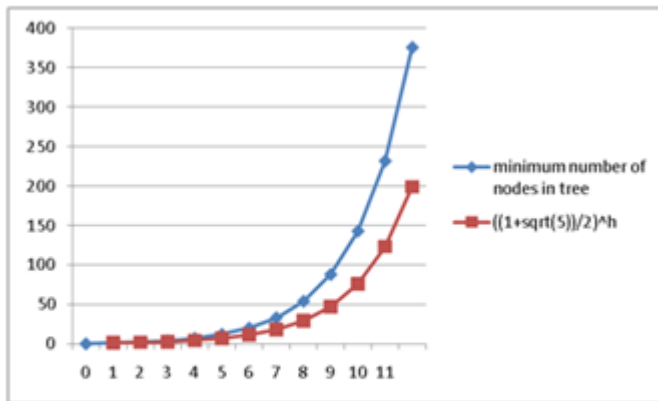
- $S(-1)=0$, $S(0)=1$, $S(1)=2$
- For $h \geq 1$, $S(h) = 1 + S(h-1) + S(h-2)$



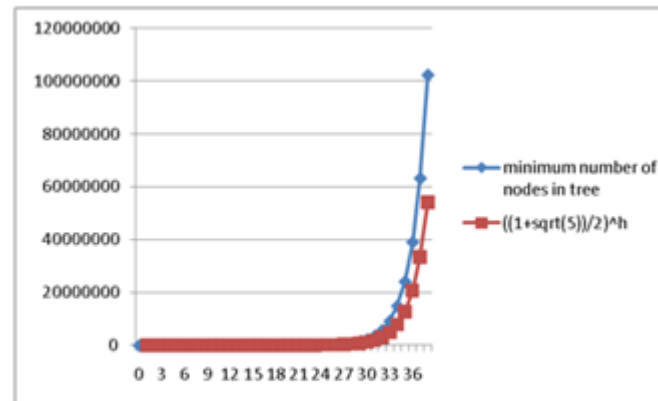
- Step 2: Show this recurrence grows really fast
 - Similar to Fibonacci numbers
 - Can prove for all h , $S(h) > \phi^h - 1$ where ϕ is the golden ratio, $(1+\sqrt{5})/2$, about 1.62
 - Growing faster than 1.6^h is “plenty exponential”

Before we prove it

- Good intuition from plots comparing:
 - $S(h)$ computed directly from the definition
 - $((1+\sqrt{5})/2)^h$
- $S(h)$ is always bigger, up to trees with huge numbers of nodes
 - Graphs aren't proofs, so let's prove it



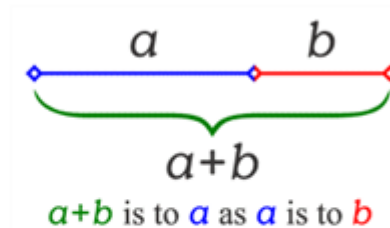
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The Golden Ratio

$$\phi = \frac{1 + \sqrt{5}}{2} \approx 1.62$$



This is a special number

- Aside: Since the Renaissance, many artists and architects have proportioned their work (e.g., length:height) to approximate the **golden ratio**: If $(a+b)/a = a/b$, then $a = \phi b$
- We will need one special arithmetic fact about ϕ :


$$\begin{aligned} \phi^2 &= ((1 + 5^{1/2}) / 2)^2 \\ &= (1 + 2 \cdot 5^{1/2} + 5) / 4 \\ &= (6 + 2 \cdot 5^{1/2}) / 4 \\ &= (3 + 5^{1/2}) / 2 \\ &= 1 + (1 + 5^{1/2}) / 2 \\ &= 1 + \phi \end{aligned}$$

The proof

$$S(-1)=0, S(0)=1, S(1)=2$$
$$\text{For } h \geq 1, S(h) = 1 + S(h-1) + S(h-2)$$

Theorem: For all $h \geq 0$, $S(h) > \phi^h - 1$

Proof: By induction on h

Base cases: 

$$S(0) = 1 > \phi^0 - 1 = 0$$

$$S(1) = 2 > \phi^1 - 1 \approx 0.62$$

Inductive case ($k > 1$):

Show $S(k+1) > \phi^{k+1} - 1$ assuming $S(k) > \phi^k - 1$ and $S(k-1) > \phi^{k-1} - 1$

$$S(k+1) = 1 + S(k) + S(k-1) \quad \text{by definition of } S$$

$$> 1 + \phi^k - 1 + \phi^{k-1} - 1 \quad \text{by induction}$$

$$= \phi^k + \phi^{k-1} - 1 \quad \text{by arithmetic (1-1=0)}$$

$$= \phi^{k-1} (\phi + 1) - 1 \quad \text{by arithmetic (factor } \phi^{k-1} \text{)}$$

$$= \phi^{k-1} \phi^2 - 1 \quad \text{by special property of } \phi$$

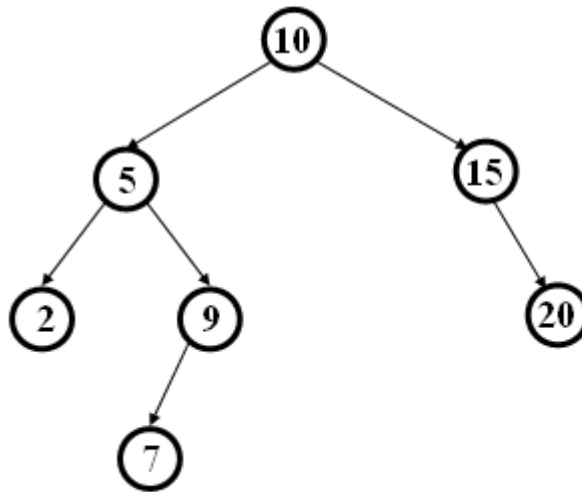
$$= \phi^{k+1} - 1 \quad \text{by arithmetic (add exponents)}$$

Good news

Proof means that if we have an AVL tree, then `find` is $O(\log n)$

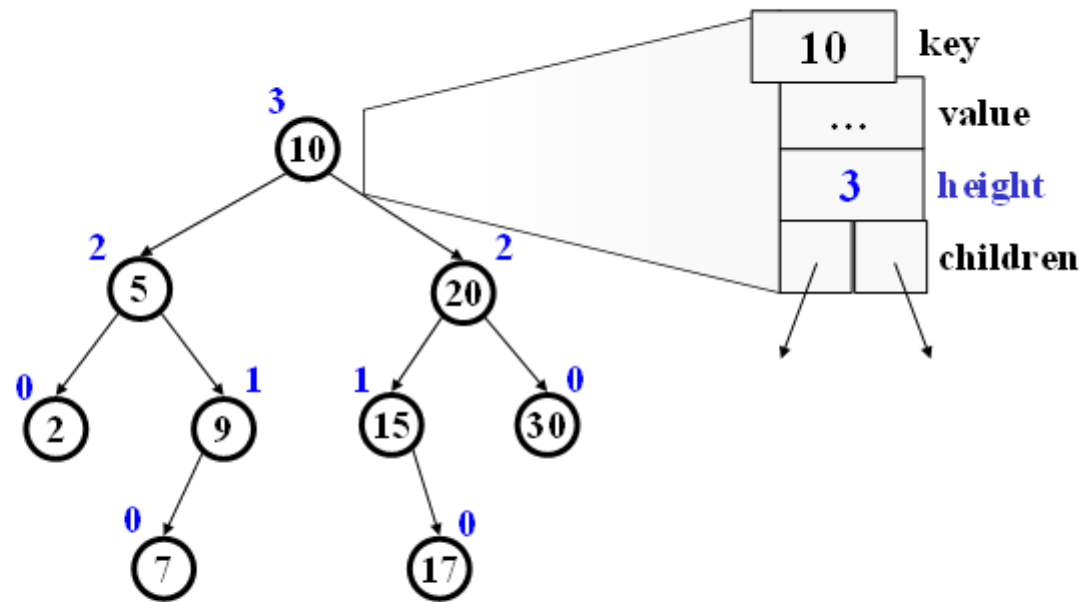
But as we **insert** and **delete** elements, we need to:

1. Track balance
2. Detect imbalance
3. Restore balance



Is this tree AVL balanced?
How about after `insert(30)`?

An AVL Tree



AVL tree operations

- **AVL find:**
 - Same as BST find
- **AVL insert:**
 - First BST insert, *then* check balance and potentially “fix” the AVL tree
 - Four different imbalance cases
- **AVL delete:**
 - The “easy way” is lazy deletion
 - Otherwise, like insert we do the deletion and then have several imbalance cases



AVL tree insert

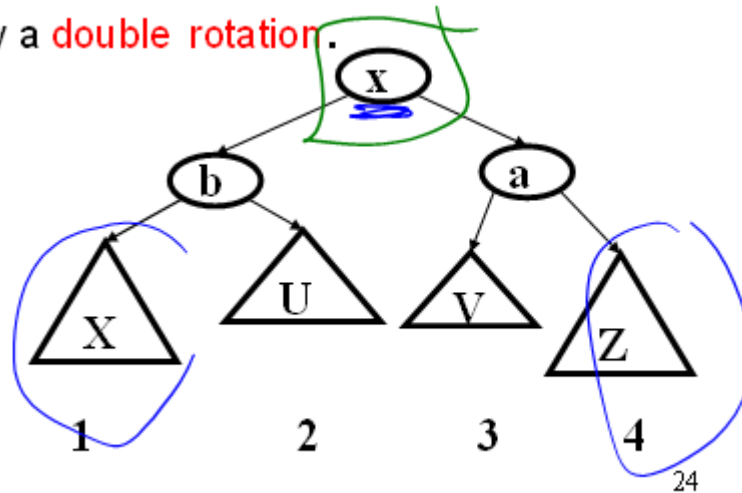
Let x be the node where an imbalance occurs.

Four cases to consider. The insertion is in the

1. left subtree of the left child of x .
2. right subtree of the left child of x .
3. left subtree of the right child of x .
4. right subtree of the right child of x .

Idea: Cases 1 & 4 are solved by a **single rotation**.

Cases 2 & 3 are solved by a **double rotation**.



Insert: detect potential imbalance

1. Insert the new node as in a BST (a new leaf)
2. For each node on the path from the root to the new leaf, the insertion may (or may not) have changed the node's height
3. So after recursive insertion in a subtree, detect height imbalance and perform a *rotation* to restore balance at that node

All the action is in defining the correct rotations to restore balance

Fact that makes it a bit easier:

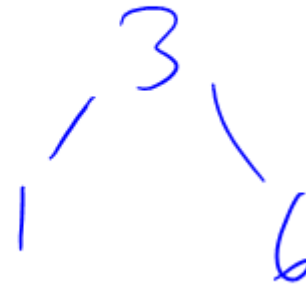
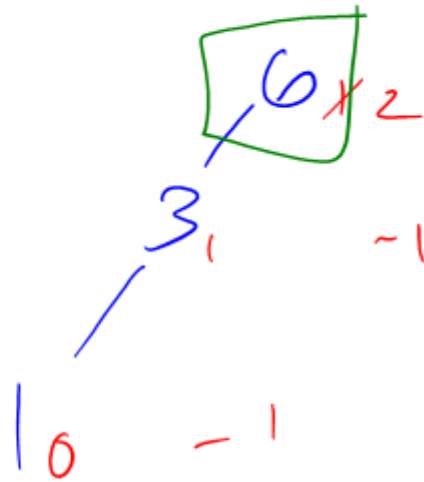
- There must be a deepest element that is imbalanced after the insert (all descendants still balanced)
- After rebalancing this deepest node, every node is balanced
- So at most one node needs to be rebalanced

Case #1 Example

Insert(6)

Insert(3)

Insert(1)



Case #1: Example

Insert(6)

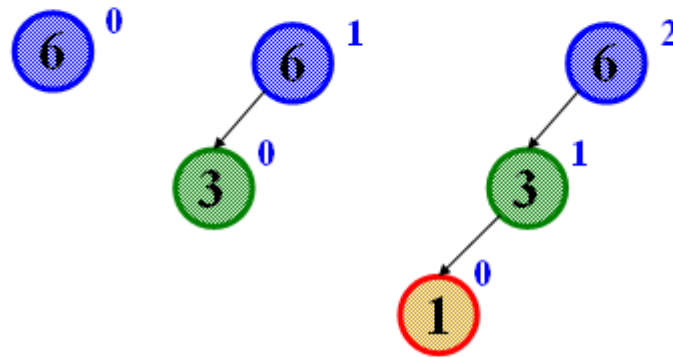
Insert(3)

Insert(1)

Third insertion violates
balance property

- happens to be at
the root

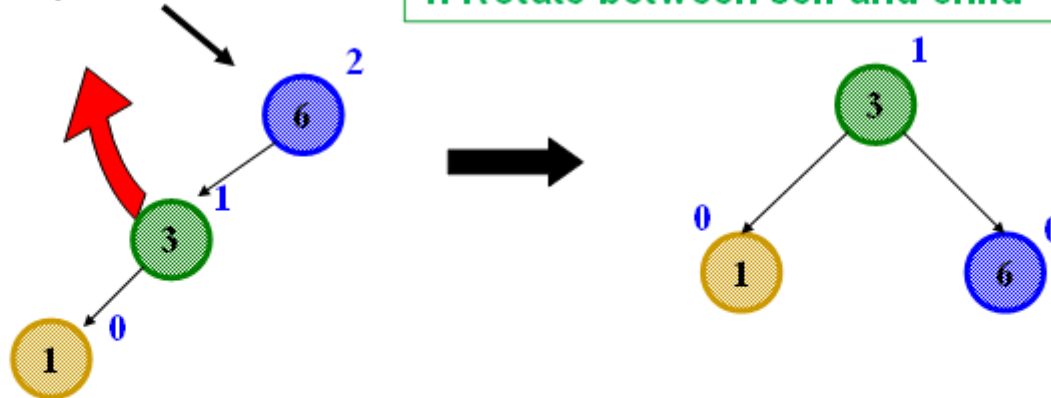
What is the only way to
fix this?



Fix: Apply “Single Rotation”

- *Single rotation*: The basic operation we'll use to rebalance
 - Move child of unbalanced node into parent position
 - Parent becomes the “other” child (always okay in a BST!)
 - Other subtrees move in only way BST allows (next slide)

AVL Property violated here

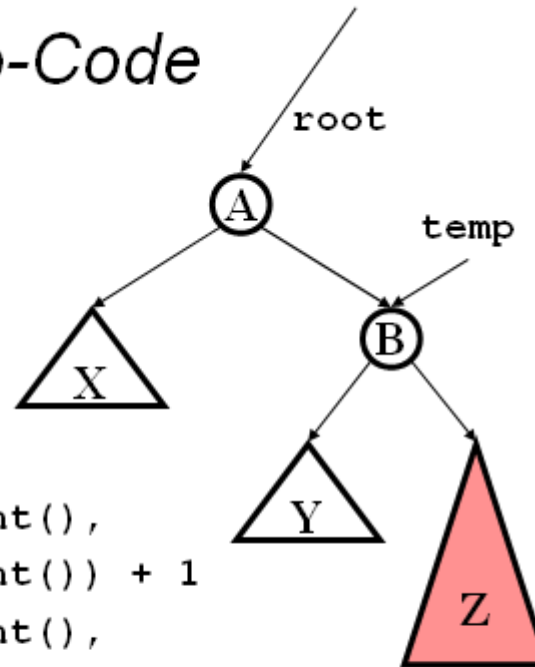


Single Rotation:
1. Rotate between self and child

RotateRight brings up the right child

Single Rotation Pseudo-Code

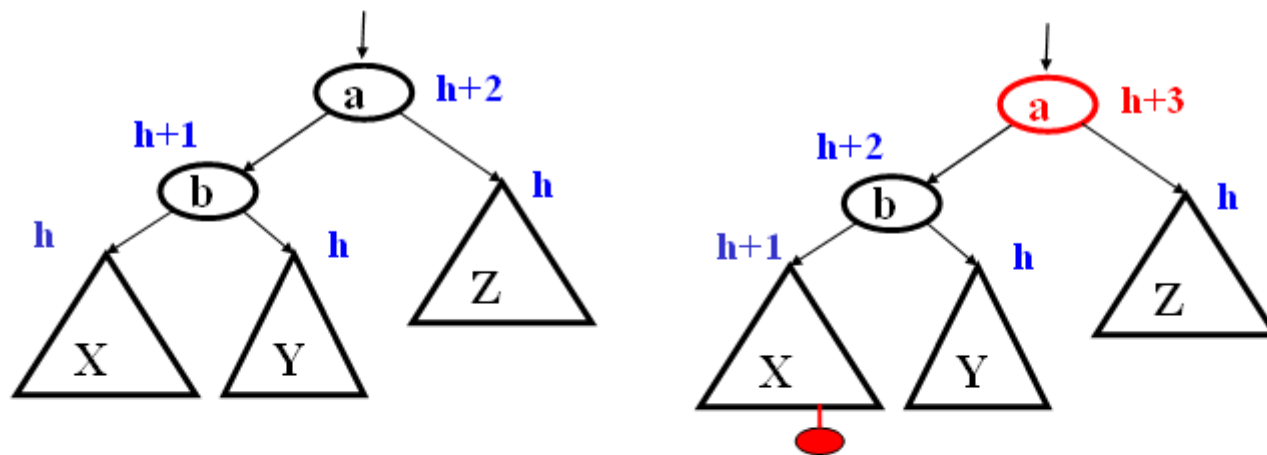
```
void RotateWithRight(Node root) {  
    Node temp = root.right  
    root.right = temp.left  
    temp.left = root  
    root.height = max(root.right.height(),  
                      root.left.height()) + 1  
    temp.height = max(temp.right.height(),  
                     temp.left.height()) + 1  
    root = temp  
}
```



Notational note:
Oval: a node in the tree
Triangle: a subtree

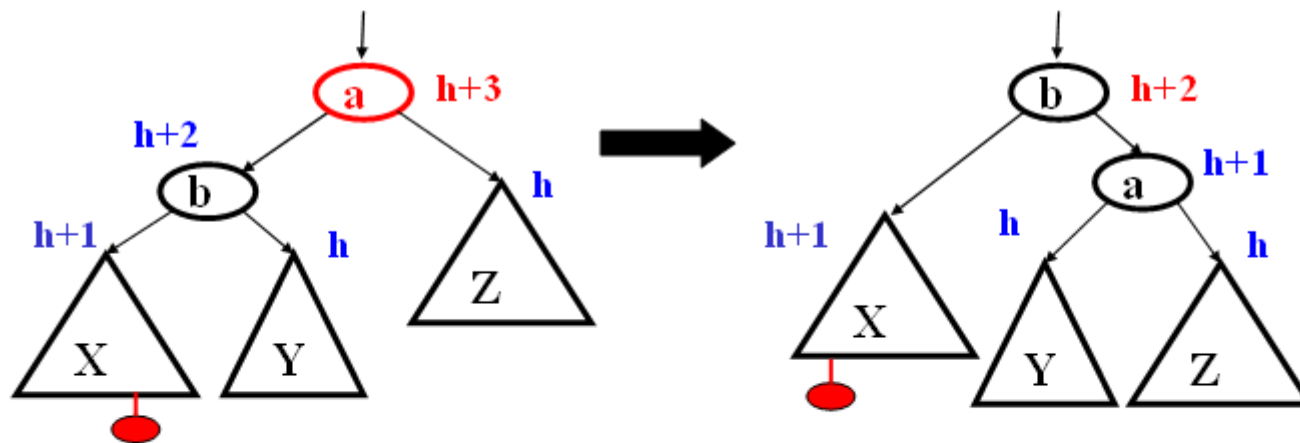
The example generalized

- Node imbalanced due to insertion *somewhere* in **left-left grandchild** increasing height
 - 1 of 4 possible imbalance causes (other three coming)
- First we did the insertion, which would make *a* imbalanced



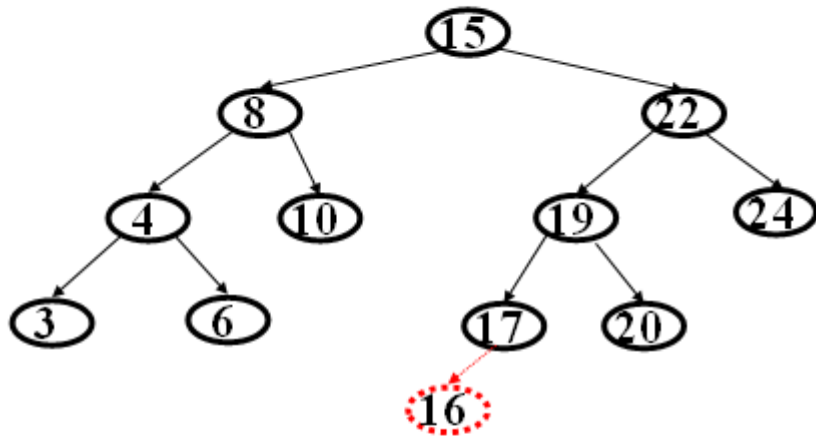
The general left-left case

- Node imbalanced due to insertion *somewhere* in **left-left grandchild** increasing height
 - 1 of 4 possible imbalance causes (other three coming)
- So we rotate at *a*, using BST facts: $X < b < Y < a < Z$

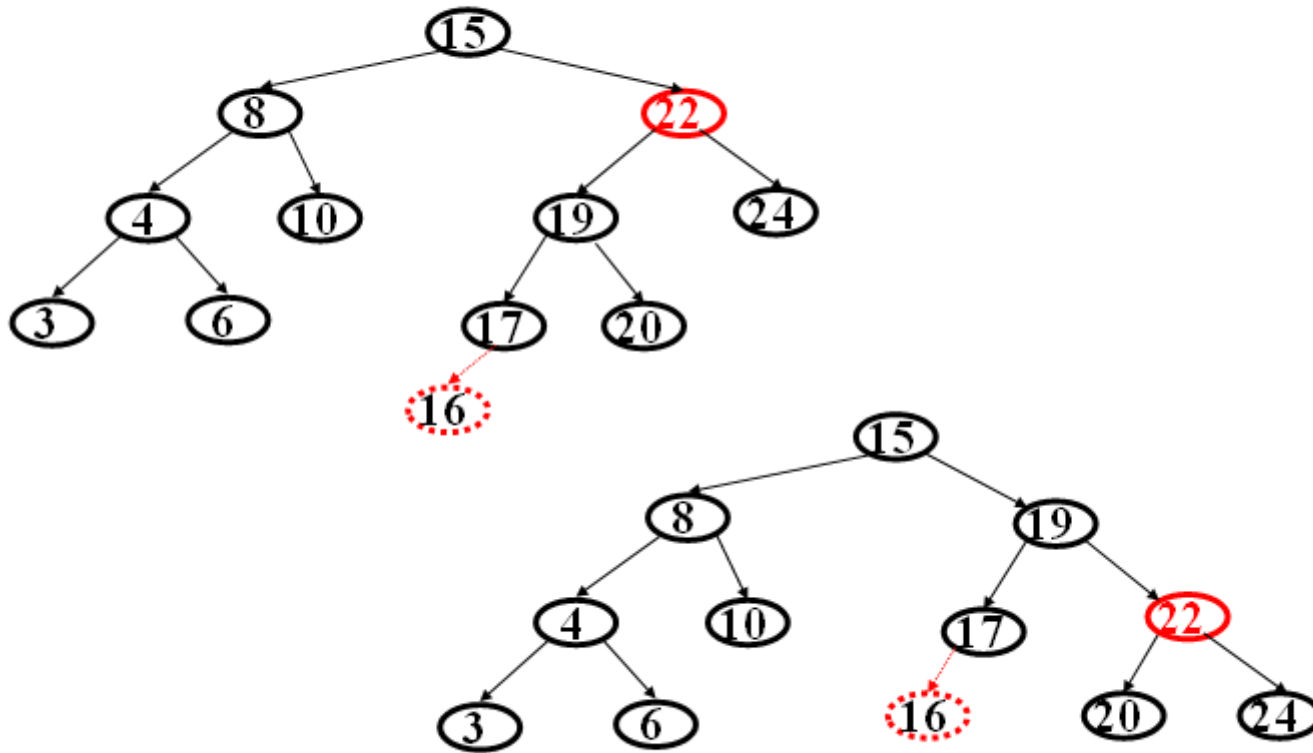


- A single rotation restores balance at the node
 - To same height as before insertion (so ancestors now balanced)

Another example: insert (16)

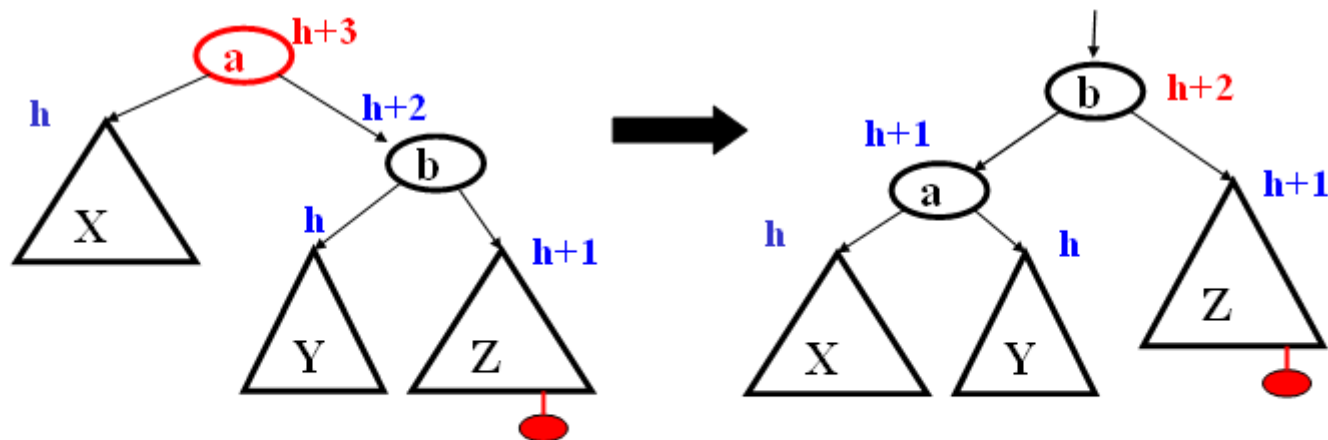


Another example: insert(16)



The general right-right case

- Mirror image to left-left case, so you rotate the other way
 - Exact same concept, but need different code

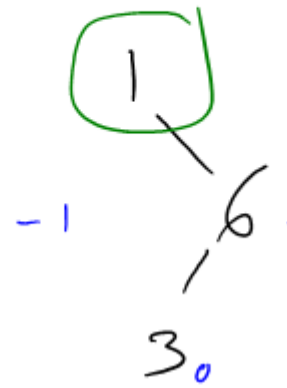


Case #3 Example

Insert(1)

Insert(6)

Insert(3)

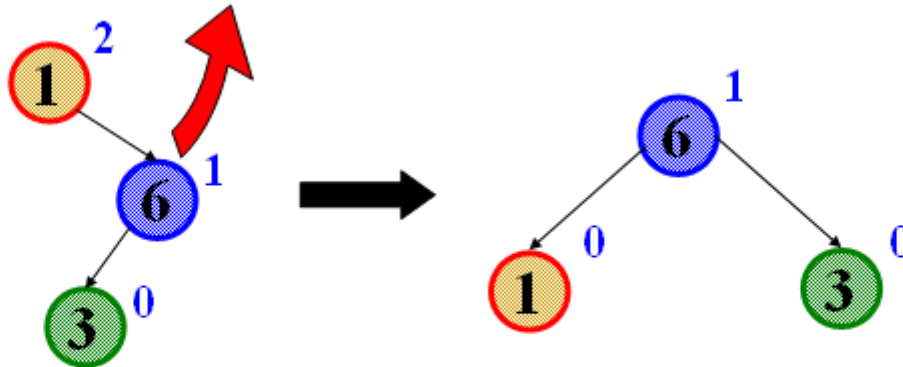


Two cases to go

Unfortunately, single rotations are not enough for insertions in the left-right subtree or the right-left subtree

Simple example: `insert(1), insert(6), insert(3)`

- First wrong idea: single rotation like we did for left-left

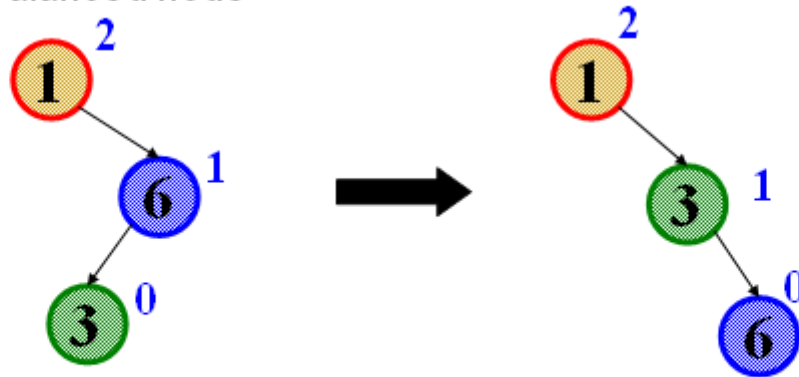


Two cases to go

Unfortunately, single rotations are not enough for insertions in the left-right subtree or the right-left subtree

Simple example: `insert(1)`, `insert(6)`, `insert(3)`

- **Second wrong idea:** single rotation on the child of the unbalanced node

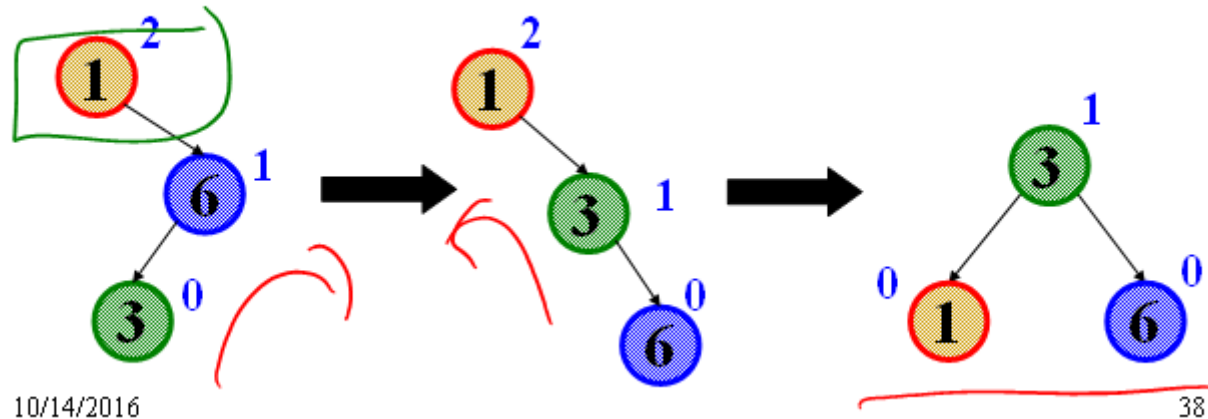


Sometimes two wrongs make a right ☺

- First idea violated the BST property
- Second idea didn't fix balance
- But if we do both single rotations, starting with the second, it works! (And not just for this example.)

Double rotation:

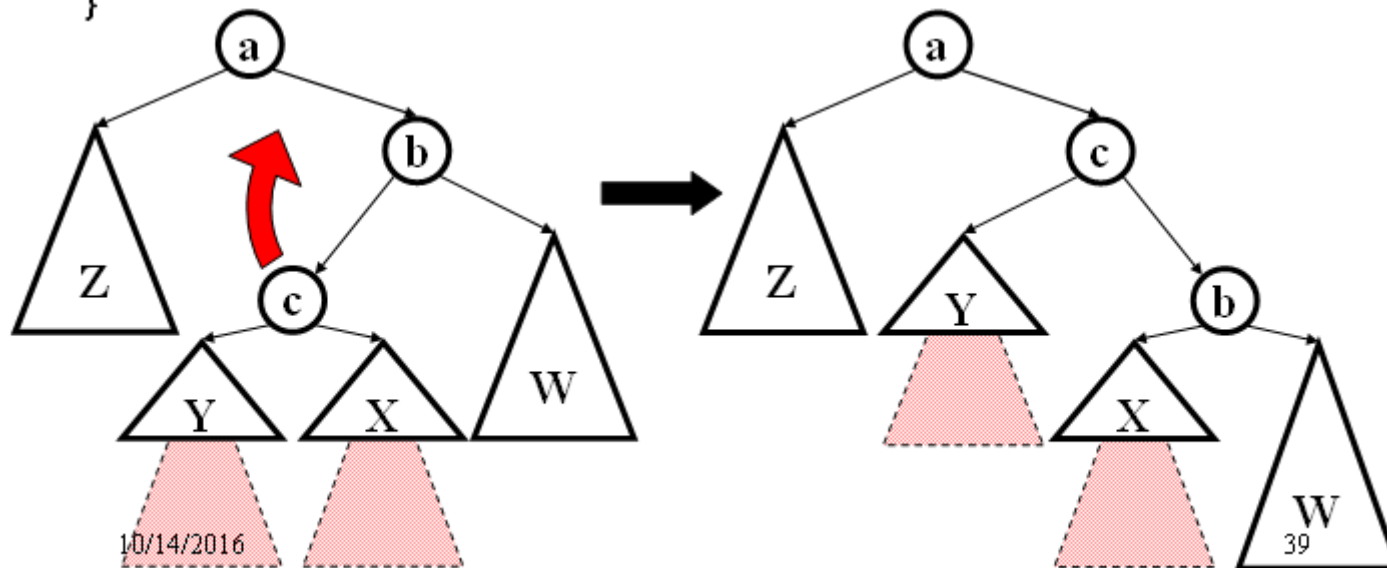
1. Rotate problematic child and grandchild
2. Then rotate between self and new child



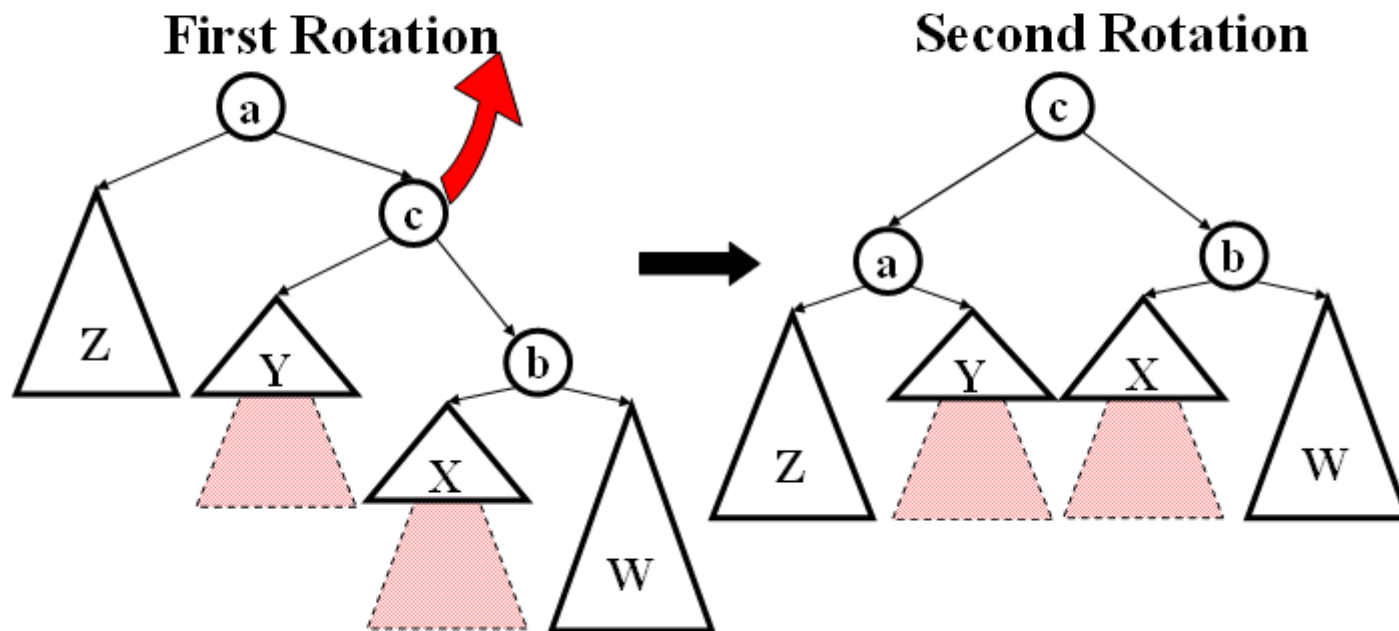
Double Rotation Pseudo-Code

```
void DoubleRotateWithRight(Node root) {  
    RotateWithLeft(root.right)  
    RotateWithRight(root)  
}
```

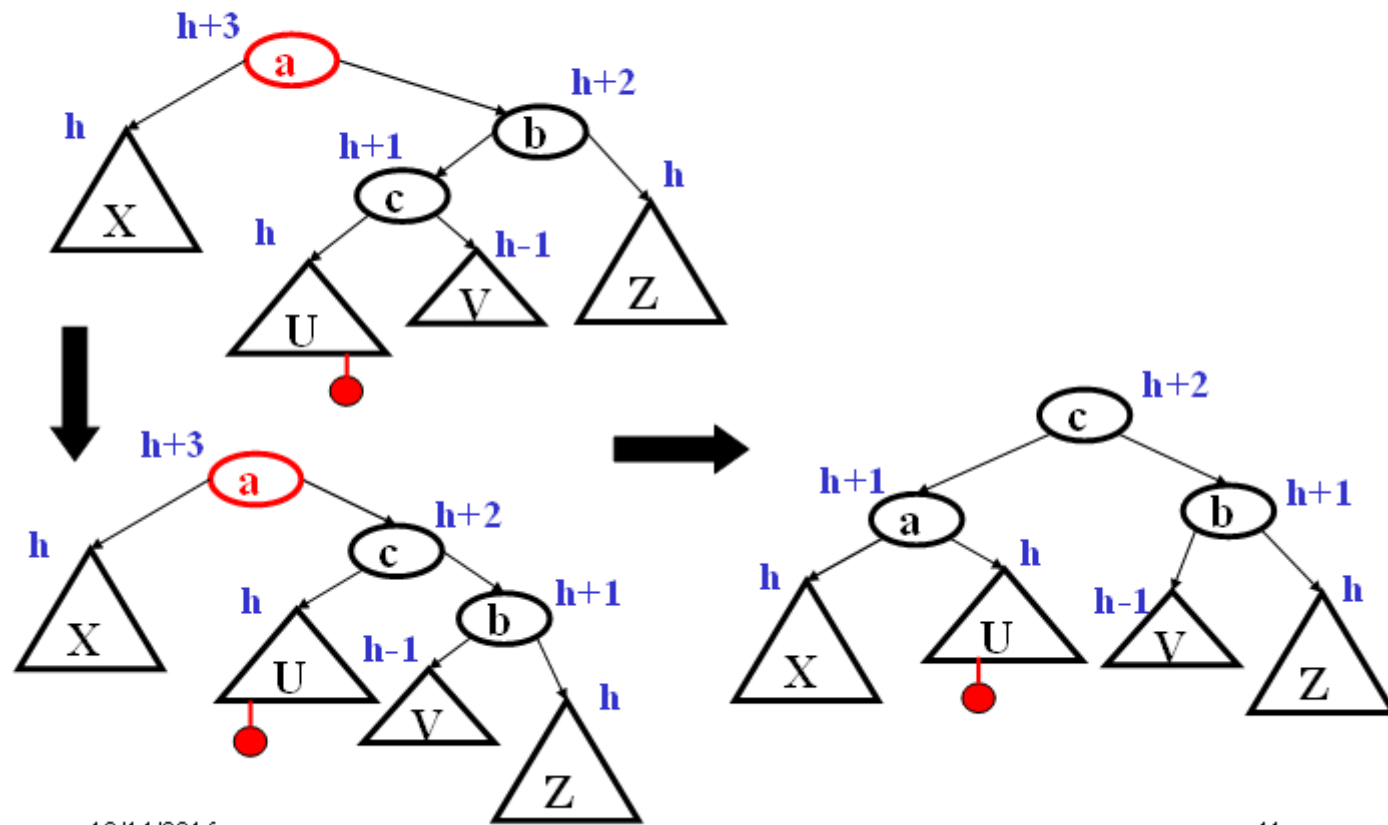
First Rotation



Double Rotation Completed

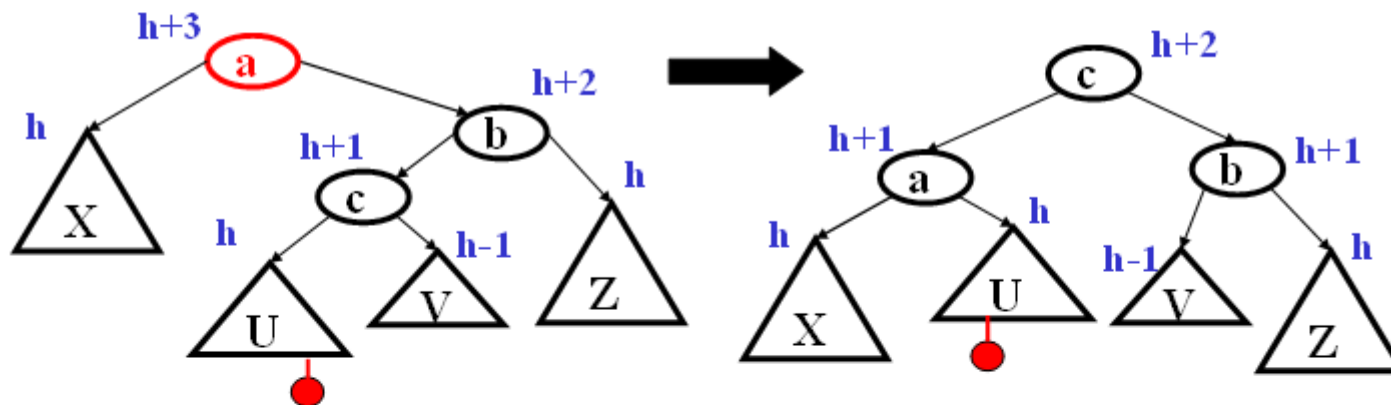


The general right-left case



Comments

- Like in the left-left and right-right cases, the height of the subtree after rebalancing is the same as before the insert
 - So no ancestor in the tree will need rebalancing
- Does not have to be implemented as two rotations; can just do:

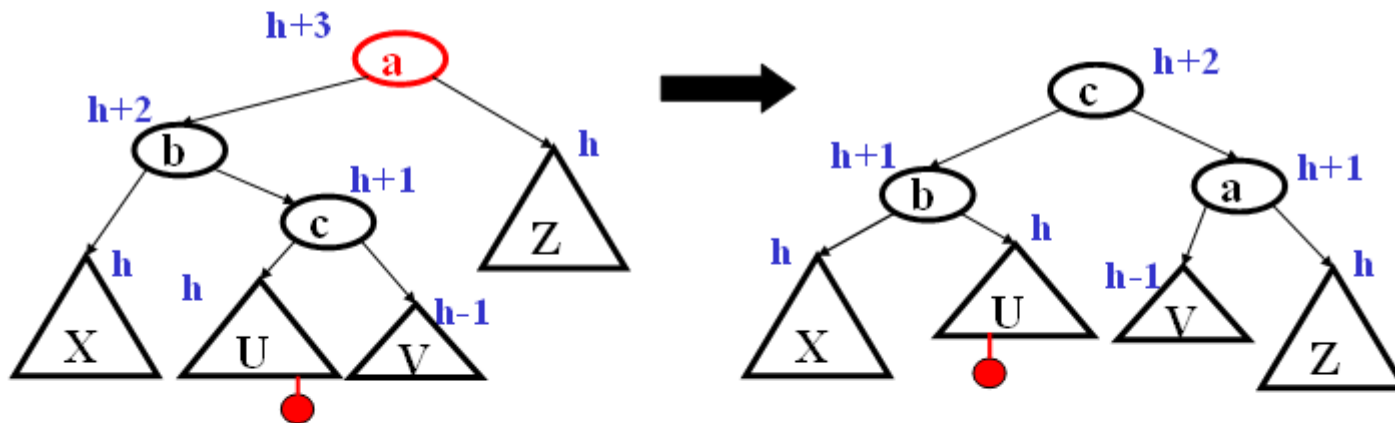


Easier to remember than you may think:

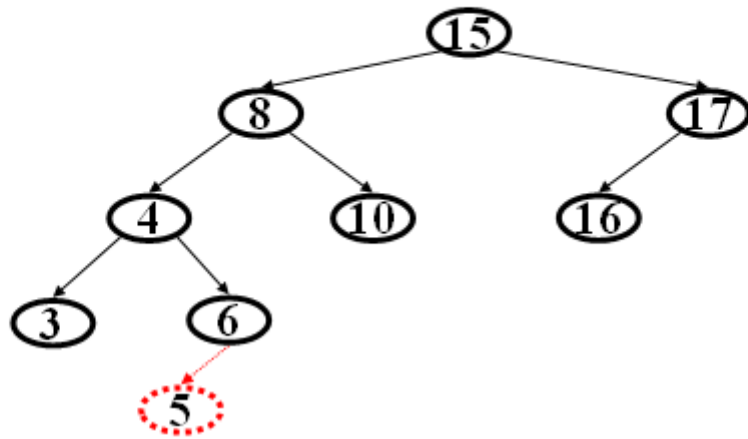
Move c to grandparent's position and then put a , b , X , U , V , and Z in the only legal positions for a BST

The last case: left-right

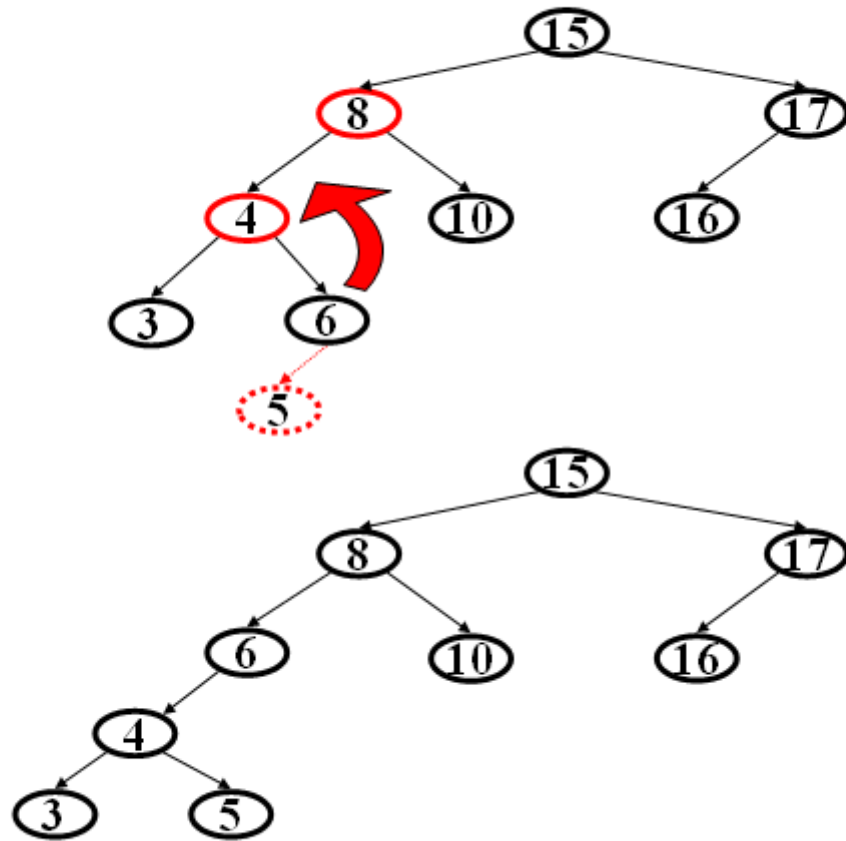
- Mirror image of right-left
 - Again, no new concepts, only new code to write



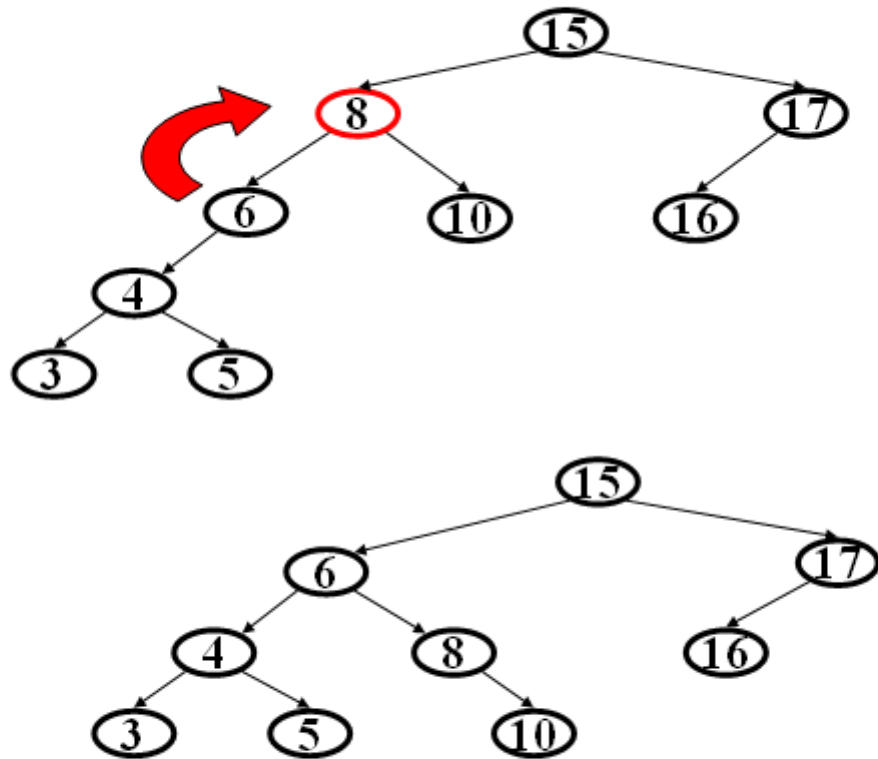
Insert 5



Double rotation, step 1



Double rotation, step 2



Insert, summarized

- Insert as in a BST
- Check back up path for imbalance, which will be 1 of 4 cases:
 - node's left-left grandchild is too tall
 - node's left-right grandchild is too tall
 - node's right-left grandchild is too tall
 - node's right-right grandchild is too tall
- Only one case occurs because tree was balanced before insert
- After the appropriate single or double rotation, the smallest-unbalanced subtree has the same height as before the insertion
 - So all ancestors are now balanced

Now efficiency

- Worst-case complexity of `find`: _____
 - Tree is balanced
- Worst-case complexity of `insert`: _____
 - Tree starts balanced
 - A rotation is $O(1)$ and there's an $O(\log n)$ path to root
 - (Same complexity even without one-rotation-is-enough fact)
 - Tree ends balanced
- Worst-case complexity of `buildTree`: _____
- `delete`? (see 3 ed. Weiss) requires more rotations: _____
- Lazy deletion? _____

Now efficiency

- Worst-case complexity of `find`: $O(\log n)$
 - Tree is balanced
- Worst-case complexity of `insert`: $O(\log n)$
 - Tree starts balanced
 - A rotation is $O(1)$ and there's an $O(\log n)$ path to root
 - (Same complexity even without one-rotation-is-enough fact)
 - Tree ends balanced
- Worst-case complexity of `buildTree`: $O(n \log n)$
- `delete?` (see 3 ed. Weiss) requires more rotations: $O(\log n)$

Pros and Cons of AVL Trees

Arguments for AVL trees:

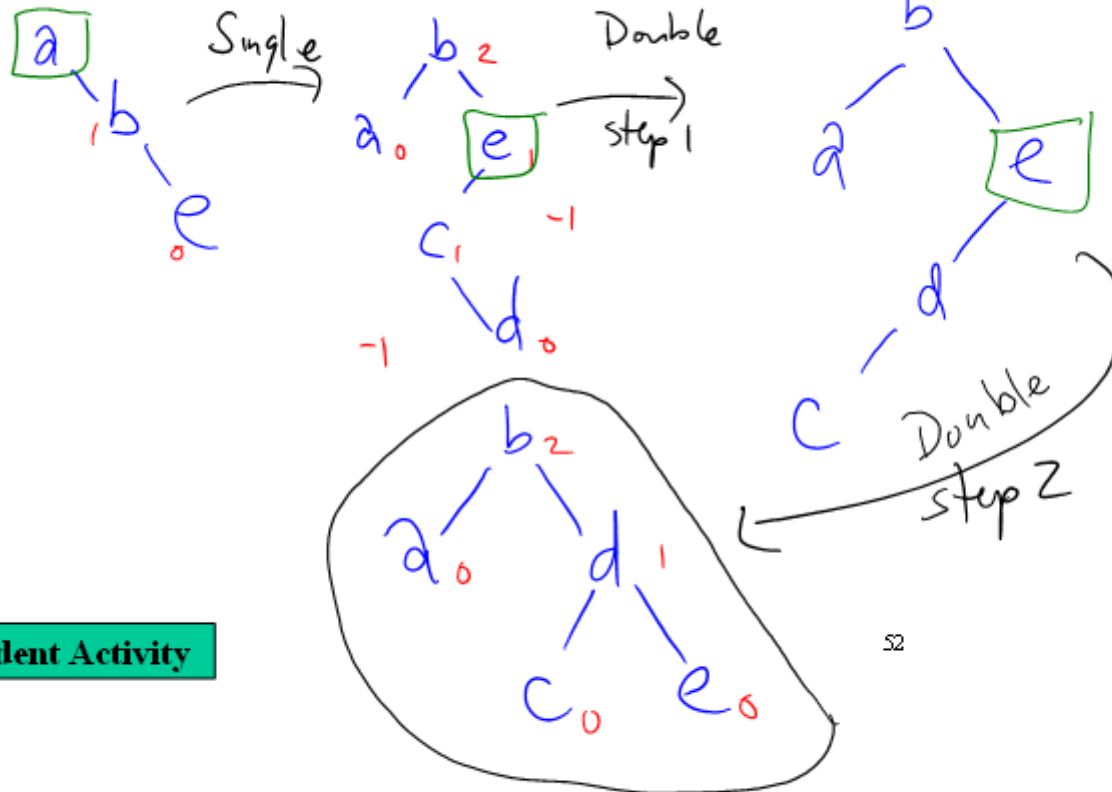
1. All operations logarithmic worst-case because trees are *always* balanced
2. Height balancing adds no more than a constant factor to the speed of `insert` and `delete`

Arguments against AVL trees:

1. Difficult to program & debug
2. More space for height field
3. Asymptotically faster but rebalancing takes a little time
4. Most large searches are done in database-like systems on disk and use other structures (e.g., B-trees, our next data structure)

More Examples...

Insert into an AVL tree: a b e c d



Single and Double Rotations:

Inserting what integer values would cause the tree to need

a:

1. single rotation?

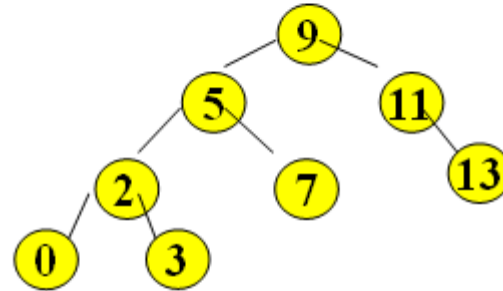
$< 0, 1, > 13$

2. double rotation?

$4, 12$

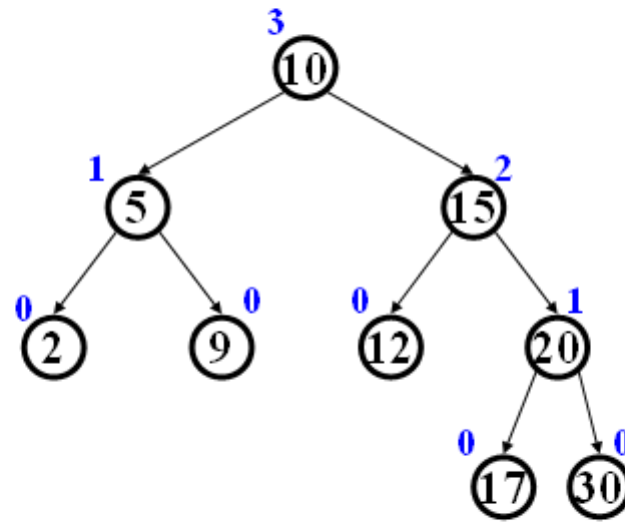
3. no rotation?

$6, 8, 10$



Easy Insert

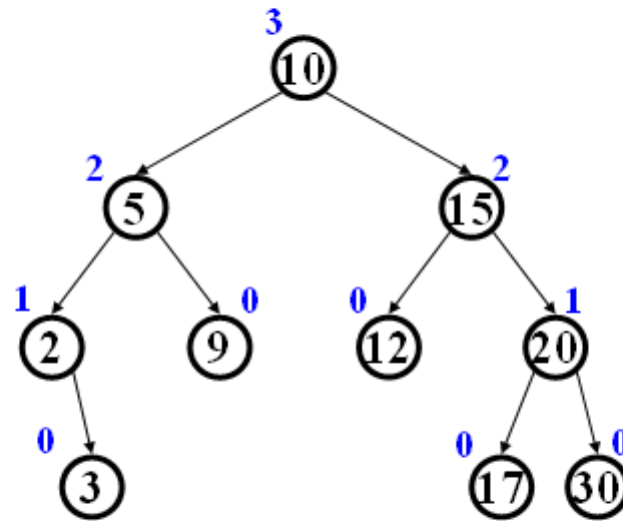
Insert(**3**)



Unbalanced?

Hard Insert

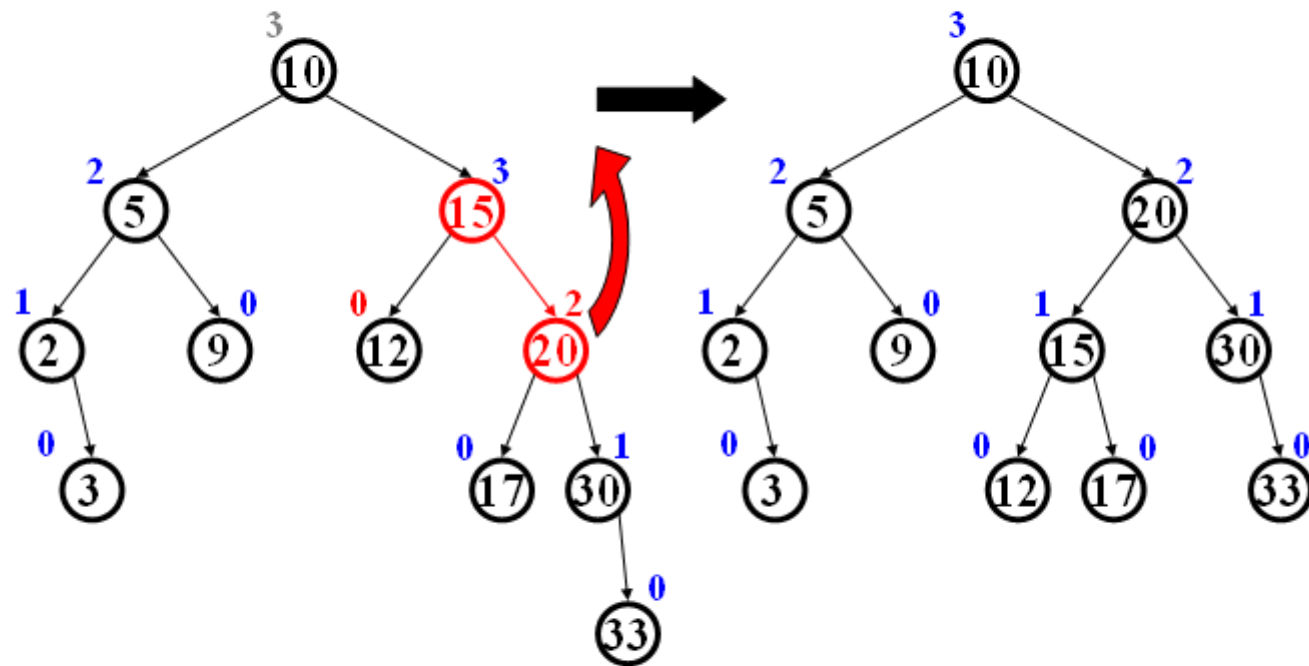
Insert(**33**)



Unbalanced?

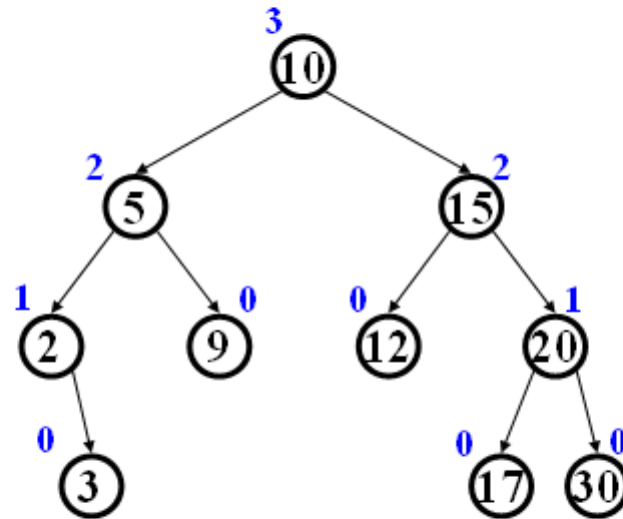
How to fix?

Single Rotation



Hard Insert

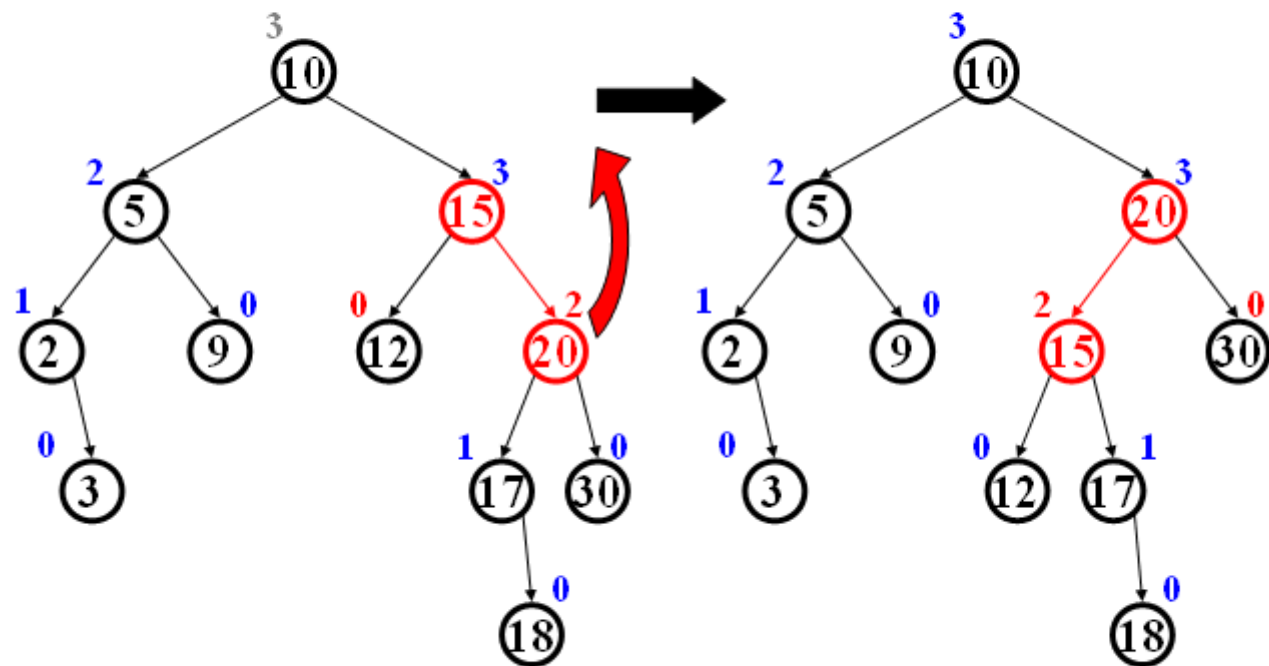
Insert(**18**)



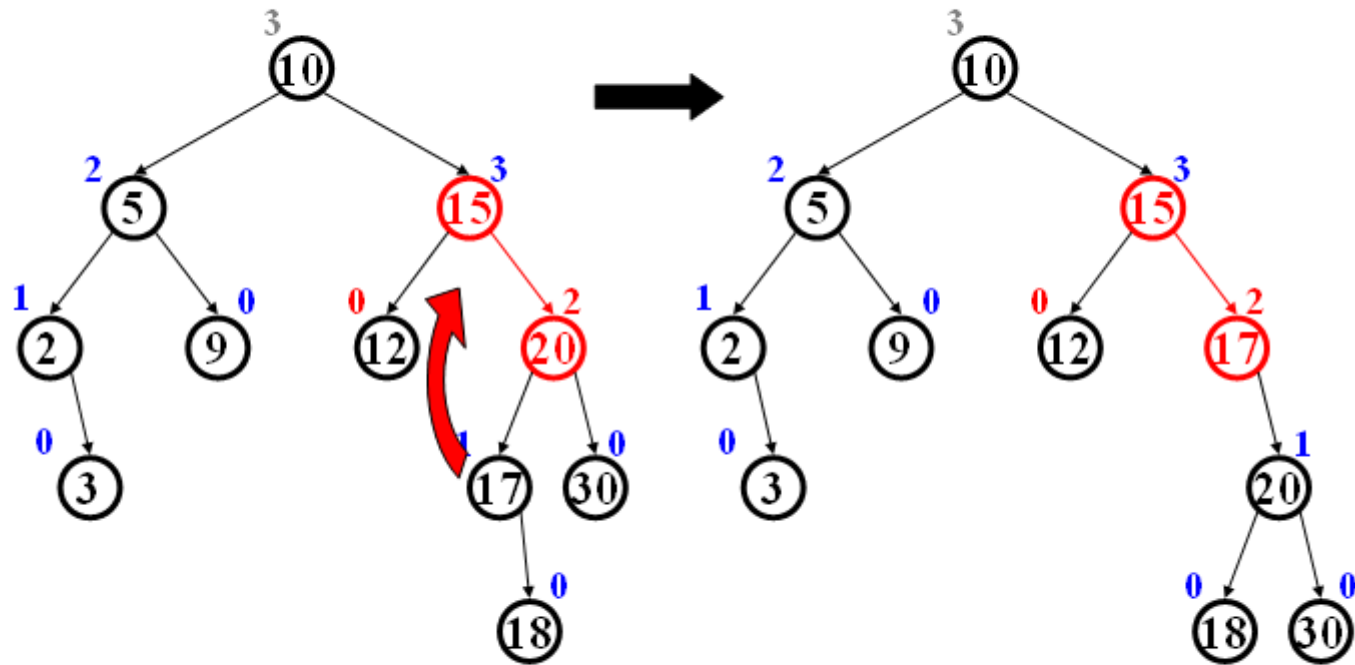
Unbalanced?

How to fix?

Single Rotation (oops!)



Double Rotation (Step #1)



Double Rotation (Step #2)

