

## COMP20003 Algorithms and Data Structures Balanced Trees

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Semester 2



## So far...

- Dictionary search with **slow** look-up or insertion:
  - Lists, sorted and unsorted
  - Array, unsorted
  - Sorted array has  $\log n$  lookup, but  $n^2$  build
- Binary search tree:
  - good **average** case, but very bad **worst** case.



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## Balanced trees

- Binary search tree:
  - **Average** case insertion and search:  $\log n$
  - **Worst** case for both:  $O(n)$

Although simple, it's usually good enough, but not reliable



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## This section

- How to get a BST to **stay balanced?**
  - or **almost** balanced...
  - ... no matter what **order** the data are inserted

Note: this material is **not covered** in Skiena.

It is **essential knowledge** for any computer scientist, however, and **is** examinable.



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## Balanced trees

- Idea: **make** BST perfectly (or **almost** perfectly) **balanced**
- In a **balanced** tree of  $n$  items, **height** is  $O(\log n)$ 
  - **Perfectly** balanced tree, height =  $\log n$ , exactly
  - Balanced tree, height =  $O(\log n)$ .
- Therefore **build** a balanced tree is  $O(n \log n)$ 
  - **Search** is  $O(\log n)$ .

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## Balanced tree implementations

- • **AVL trees**
- 2-3-4 trees
- B+ trees
- Red-black trees

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## Balanced Trees and Binary Search Trees

- In balanced trees, **during insertion** there are mechanisms for **making sure** the tree **does not grow unbalanced**
- At the same time, the BST **ordering is preserved**
- So, **search** in a balanced tree is exactly the same as binary tree
- The only difference is that it is  $O(\log n)$

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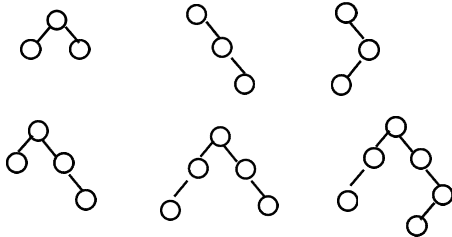
## AVL Trees

The first balanced tree:

- **Insert node** + Keep **track** of **height** of **subtrees** of **every** node.
  - **Balance node** every time **difference** between subtree heights is **>1**.
  - Basic balancing operation: **Rotation**.

Adelson-Velskii, G.; E. M. Landis (1962). "An algorithm for the organization of information". Proceedings of the USSR Academy of Sciences **146**: 263-266. (Russian) English translation by Myron J. Ricci in Soviet Math. Doklady **3**:1259-1263, 1962.

## Do these trees satisfy the AVL condition? Why / why not?

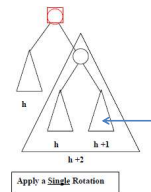


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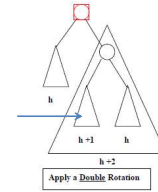
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## Non-AVL Trees caused by...

Outside insertion



Inside insertion

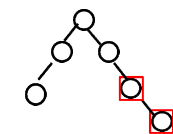
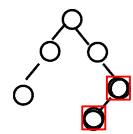
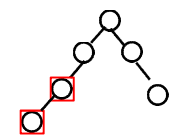
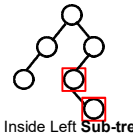


Symmetrical case is handled identically!

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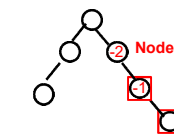
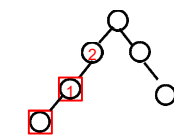
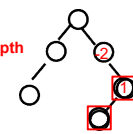
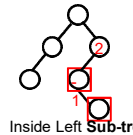
## Unbalanced tree Categories

Outside Right **Sub-tree**  
Right Child (RR)Inside Right **Sub-tree**  
Left Child (RL)Outside Left **Sub-tree**  
Left Child (LL)Inside Left **Sub-tree**  
Right Child (LR)

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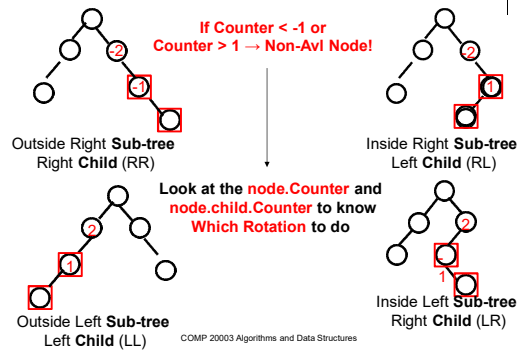
## Unbalanced tree Categories

Outside Right **Sub-tree**  
Right Child (RR)Outside Left **Sub-tree**  
Left Child (LL)Counter =  
 $\text{Node.left.depth} - \text{node.right.depth}$ Inside Right **Sub-tree**  
Left Child (RL)Inside Left **Sub-tree**  
Right Child (LR)

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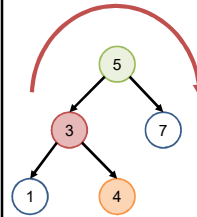
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## Unbalanced tree Categories

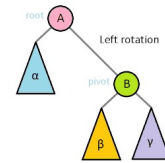
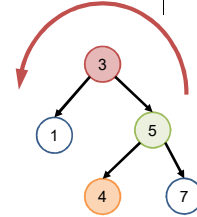


## Rotation

Right Rotation



Left Rotation



Right Rotation



```
RotateR(node)
{
    //Auxiliary variables
    left = node.Left;
    leftRight = left.Right;
    parent = node.Parent;

    //Operations
    left.Parent = parent;
    left.Right = node;
    node.Left = leftRight;
    node.Parent = left;
}
```

```
RotateR(5)
{
    //Auxiliary variables
    left = 3;
    leftRight = 4;
    parent = Null;

    //Operations
    3.Parent = Null;
    3.Right = 5;
    5.Left = 4;
    5.Parent = 3;
}
```

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Left Rotation



```
RotateL(node)
{
    //Auxiliary variables
    right = node.Right;
    rightLeft = right.Left;
    parent = node.Parent;

    //Operations
    right.Parent = parent;
    right.Left = node;
    node.Right = rightLeft;
    node.Parent = right;
}
```

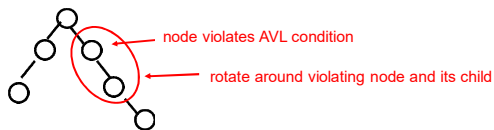
```
RotateL(3)
{
    //Auxiliary variables
    right = 5;
    rightLeft = 4;
    parent = Null;

    //Operations
    5.Parent = Null;
    5.Left = 3;
    3.Right = 4;
    3.Parent = 5;
}
```

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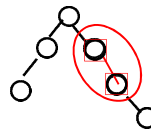
## How does rotation help balance a tree?



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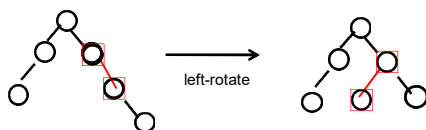
## How does rotation help balance a tree?



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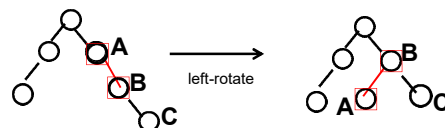
## How does rotation help balance a tree?



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## How does rotation help balance a tree?



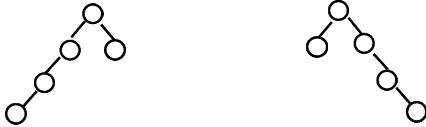
◦ **LeftLeft/RightRight**-rotation (single) :

- Take non-AVL node:
  - **Rotate** Child and node
  - Keep **ordered** subtree!

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## Which Rotation should we apply?



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## Exercise: Rotate? If so, do it...



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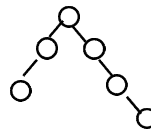
## Exercise: Rotate? If so, do it...



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## How does rotation help balance a tree?



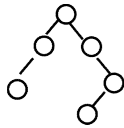
We have shown that:  
**in these cases (LL/RR),**  
 Rotation rebalances the tree.

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## How does rotation help balance a tree?

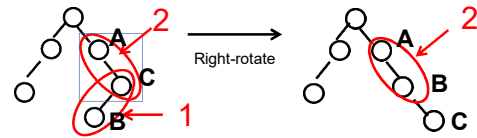
What about in these cases (LR/RL)?



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## RL and LR: Double rotation



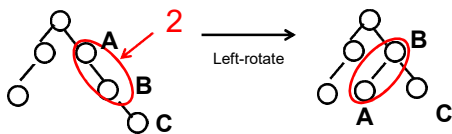
Right Left (RL) double Rotation:

- First rotation swaps Grandchild and child (Right Rotation)

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## RL and LR: Double rotation



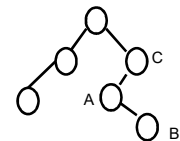
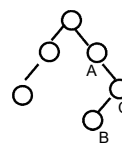
Right Left (RL) double Rotation:

- Second rotation swaps Parent and child (Left Rotation), as before

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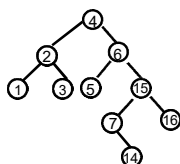
Why not just left rotate?



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## Exercise: Rotate? If so, do it...



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- Note that since **rotations preserve** the **BST ordering** of the tree, **search is the same** as for a BST.

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## AVL Trees

- Good** features:
  - Tree is **always** reasonably balanced
  - Actually, height  $\leq 1.44 \log_2 n$
  - Therefore complexity for any search is  $O(?)$
- Less ideal** features:
  - Very fiddly to code**, must keep track of
    - insertion path and
    - size of all subtrees
  - Balancing adds time (but **constant time**)

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```

node* insert ( node* tree, node* new_node )
{
    if ( tree == NULL )
        tree = new_node;
    else if ( new_node->key < tree->key ) {
        tree->left = insert ( tree->left, new_node );
        /* Fifty lines of left balancing code */
    }
    else {
        tree->right = insert ( tree->right, new_node );
        /* Fifty lines of right balancing code */
    }
    return tree;
}

```

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## Other resources for AVL trees

Tutorial on AVL trees by A. Gunawardena, Carnegie Mellon Institute  
<http://www.youtube.com/watch?v=EsgAUiXbOBo> (25 minutes)

„Interactive Demo!  
<https://www.cs.usfca.edu/~galles/visualization/AVLtree.html>

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## Balanced Trees (so far)

- AVL trees use **rotation** to keep the tree **balanced**
- **Rotations** are a **general operation**, used in other situations, not just AVL trees.

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## 2,3,4-Trees: Overview

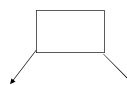
- Trees **do not** have to be **binary**!
- Nodes in **2,3,4-Trees** have:
  - 1, 2, or 3 keys
  - 2, 3, or 4 pointers, correspondingly.
- Items are inserted **only into leaf nodes**
- When **4-nodes** are full – **split** to accommodate new items.
- Tree **height** grow **slowly**

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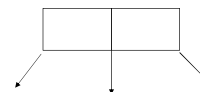
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## 2-3-4 Tree nodes

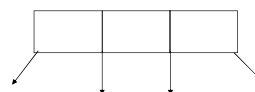
2-node



3-node



4-node



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## 2,3,4-Trees

- Note that tree remains **balanced** *even when items are inserted in sorted order.*
- **Height** of tree: between  $\log_4 n$  and  $\log_2 n$
- 2-3-4 also known as **B-trees** of order 4

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## B+-Trees

- <https://www.cs.usfca.edu/~galles/visualization/BPlusTree.html>
- B+-trees: **generalization of the 2,3,4 tree**
- Nodes have many pointers:
  - Typically 256-512
  - Depth of tree is  $\log_{(\text{very large number})} n$
- Used for storing **large databases** on disk, where accesses are very expensive.
- **Only leaf** contain **data**, internal nodes are only intervals
- **Leaves** may include **pointer to next leaf**, to speed up sequential access

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## Red-Black Trees

- **Red-black** trees implement a **2-3-4** tree as a **binary search tree**, using **rotation** to keep balance
- **Beyond the scope of this subject**
- An excellent description is found in Sedgewick, Algorithms in C, Parts 1-4, Section 13.4.

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## Splay Trees

- A **splay** tree is a **self-adjusting** tree
- Insertion:
  - Insert as for BST
  - "Splay" **new node** to the root
- Splay: do a **series of rotations**, that bring the node **closer to the root**

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## Splay Trees

- Search:
  - Search as for BST
  - “Splay” the **searched node** to the root

Note: might be  $O(n)$  search in a **stick tree**, but then splaying **bushes** out the tree

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## Splay Trees

Overall:

- A **single search** might take **linear** time.

BUT over time:

- The tree gets **bushier**.
- **Highly accessed nodes** are **closer** to the root

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## Splay Trees

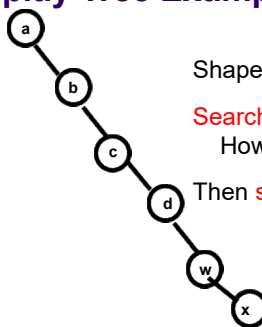
- Splay tree analysis: **amortized** over a series of searches
- Cope well with **non-uniform** access

Sleator and Tarjan, *Self-Adjusting Binary Search Trees*, *JACM* **32**(3), 1985, 652-686.

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## Splay Tree Example



Shape: a **stick**, height 5

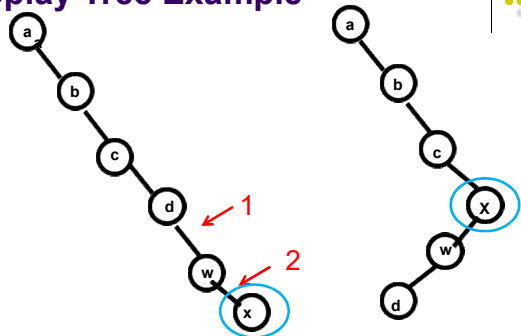
**Search** for node **x**:  
How many comparisons?

Then **splay** **x** to root.

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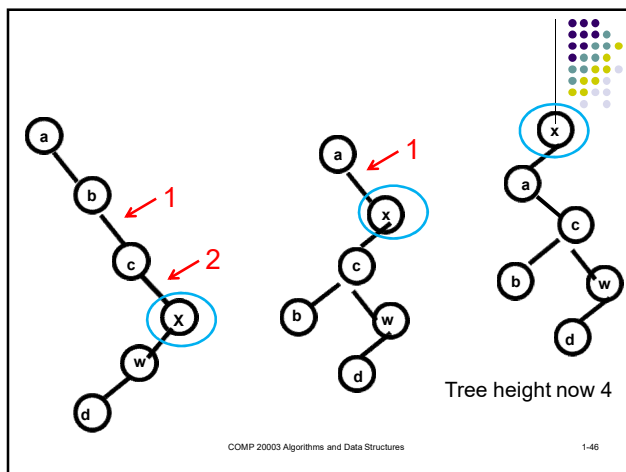
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## Splay Tree Example



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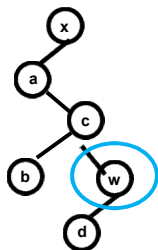
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Now **search** for **w**



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## Good things about balanced trees

Always **relatively** balanced for AVL, 2-3-4, B

On **average** balanced for splay trees

$O(\log n)$  search for AVL, 2-3-4, B.

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## Skip Lists: A Probabilistic Alternative to Balanced Trees



- Skip lists are lists pretending to be balanced trees
- They have excellent  $\log n$  search behaviour,
- BUT, they are a probabilistic algorithm
  - There is an extremely high probability that a skip list search will complete in  $\log n$  time
  - But there is always an infinitesimal probability of worst case linear behaviour

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