Programming in Haskell: Lectures 23 & 24

S P Suresh

November 4 & 6, 2019

Suresh

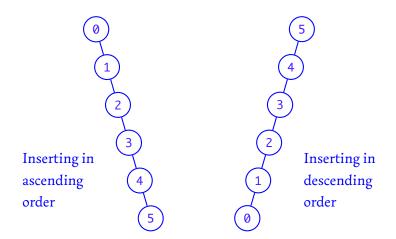
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- Inserting in ascending or descending order results in highly skewed trees



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 - Height is $1 + (\log n/2 + 1) = 1 + (\log n 1 + 1) = \log n + 1$

• Not easy to maintain size balance

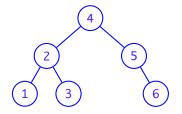
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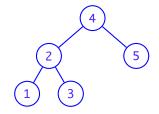
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- Height is still $O(\log n)$





Height-balanced and size-balanced

Height-balanced, not size-balanced

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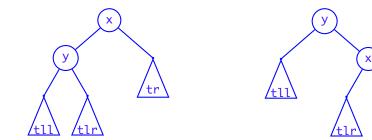
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Tree rotations - rotate right

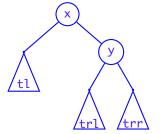


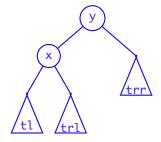
- Useful when tll has large height
- In Haskell:

rotateRight (Node x (Node y tll tlr) tr)
 = Node y tll (Node x tlr tr)

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Tree rotations - rotate left





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- Need to update height after each operation

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• Extracting the height of a tree:

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```

• Also need a measure of how skewed a tree is - its slope

slope :: AVL a -> Int
slope Nil = 0
slope (Node _ tl tr) = height tl - height tr
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• Check if t is an AVL tree:

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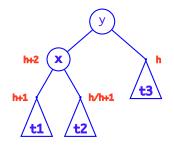
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- In a height balanced tree, abs slope < 2
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- Violations happen only at nodes visited by operation
- We rebalance each node on the path visited by operation

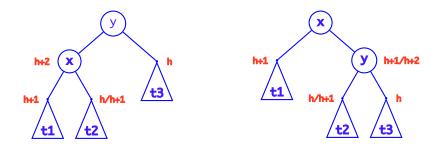
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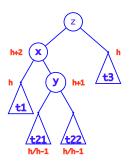


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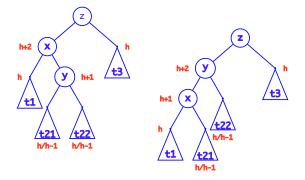
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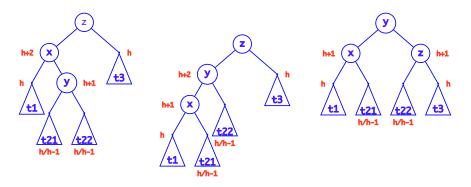


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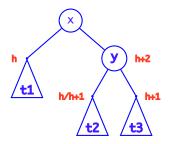
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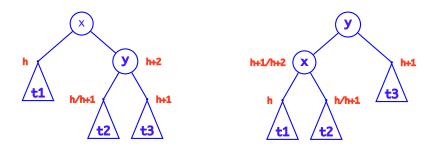
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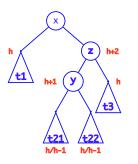


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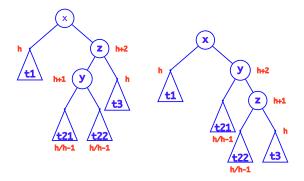
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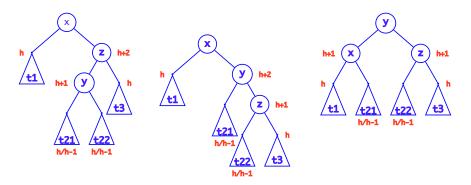
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Rebalancing in Haskell

• The rebalance function

```
rebalance :: Ord a \Rightarrow AVL a \Rightarrow AVL a
rebalance t@(Node h x tl tr)
    | abs st < 2 = t
    st == 2 = if stl == -1 then
                 rotateRight (Node h x (rotateLeft tl) tr)
                 else rotateRight t
    st == -2 = if str == 1 then
                  rotateLeft (Node h x tl (rotateRight tr))
                  else rotatel eft t
    where (st, stl, str) = (slope t, slope tl, slope tr)
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Constant time operation

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Searching in an AVL tree

Inserting in a tree

```
insertAVI :: Ord a \Rightarrow a \Rightarrow AVI a \Rightarrow AVI a
insertAVL v Nil = Node 1 v Nil Nil
insertAVL v t@(Node h x tl tr)
    | v < x = rebalance (Node nhl x ntl tr)
    | v > x = rebalance (Node nhr x tl ntr)
    | v == x = t
    where
        ntl = insertAVL v tl
        ntr = insertAVL v tr
        nhl = 1 + max (height ntl) (height tr)
        nhr = 1 + max (height tl) (height ntr)
```

Deleting the maximum element

deleteMax :: Ord a => AVL a -> (a, AVL a)
deleteMax (Node _ x tl Nil) = (x, tl)
deleteMax (Node h x tl tr) = (y, rebalance (Node nh x tl ty))
where

(y, ty) = deleteMax tr
nh = 1 + max (height tl) (height ty)

Deleting from a tree

```
deleteAVL :: Ord a \Rightarrow a \rightarrow AVL a \rightarrow AVL a
deleteAVL v Nil = Nil
deleteAVL v t@(Node h x tl tr)
    | v < x = rebalance (Node nhl x ntl tr)
    | v > x = rebalance (Node nhr x tl ntr)
    v == x = if isEmpty tl then tr
               else rebalance (Node nhy y ty tr)
  where
    (y, ty) = deleteMax tl
    (ntl, ntr) = (deleteAVL v tl, deleteAVL v tr)
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- A sequence of *n* operations take at most $O(n \log n)$ time

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• Create an AVL tree from a list $(O(n \log n) \text{ time})$:

createAVL :: Ord a => [a] -> AVL a
createAVL = foldl' (flip insertAVL) emptyAVL

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• Create a sorted list from an AVL tree:

inorder :: Ord a => AVL a -> [a]
inorder Nil = []
inorder (Node _ x tl tr) = inorder tl ++ [x] ++ inorder tr

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- T(n) = 2T(n/2) + c, so T(n) = O(n)
- We can sort a list in $O(n \log n)$ time by:

treesort :: Ord a => [a] -> [a]
treesort = inorder . createAVL

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- If l itself is sorted, t is search tree
- This is just the smart createTree we saw in a previous class
- Works in O(n) time

inorderTree

```
inorderTree :: [a] -> AVL a
inorderTree l = fst (go (length l) l)
    where
        qo :: Int \rightarrow [a] \rightarrow (AVL a, [a])
        ao 0 xs = (Nil, xs)
        go n xs = (Node h y tl tr, zs)
             where
                 m = n \ div \ 2
                 (tl, y:ys) = go m xs
                 (tr, zs) = qo (n-m-1) ys
                 h = 1 + max (height tl) (height tr)
```

A module for AVL trees

• Saved in AVL.hs

```
data AVL a = Nil | Node Int a (AVL a) (AVL a)
    deriving (Eq, Ord)
```

```
instance Show a => Show (AVL a) where
    show t = intercalate "\n" (draw t)
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• Can be used to define the Set ADT

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The Set ADT again

```
data Set a = Set (AVL a)
instance (Ord a, Show a) => Show (Set a) where
show (Set t) = show (inorder t)
```

```
emptySet :: Ord a => Set a
emptySet = Set emptyAVL
```

The Set ADT again

```
createSet :: Ord a => [a] -> Set a
createSet = Set . createAVL
```

```
search :: Ord a => a -> Set a -> Bool
search x (Set t) = searchAVL x t
```

```
insertInto :: Ord a => a -> Set a -> Set a
insertInto x (Set t) = Set (insertAVL x t)
```

```
deleteFrom :: Ord a => a -> Set a -> Set a
deleteFrom x (Set t) = Set (deleteAVL x t)
```

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More set operations

unionMerge :: Ord a => [a] -> [a] -> [a] unionMerge [] ys = ys unionMerge xs [] = xs unionMerge (x:xs) (y:ys) | x < y = x:unionMerge xs (y:ys) | y < x = y:unionMerge (x:xs) ys | x == y = x:unionMerge xs ys

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 - search, insertInto and deleteFrom in $O(\log n)$ time
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