

Introduction to Programming: Lecture 11

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The binary tree datatype

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data Btree a = Nil | Node (Btree a) a (Btree a)
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      (Node (Node Nil 2 Nil) 3 (Node Nil 5 Nil))
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Levels

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```
mylevels: Btree a -> [[a]]
```

```
mylevels Nil = []
```

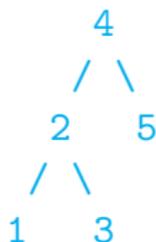
```
mylevels (Node tl x tr) =
```

```
  [x]:(join (mylevels tl) (mylevels tr))
```

```
level t = concat (mylevels t)
```

Levels

- ▶ List nodes level by level and from left to right within each level.



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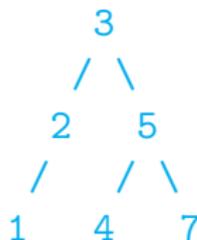
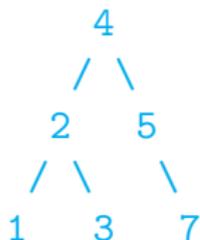
```
level t = concat (mylevels t)
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Search trees

- ▶ In a search tree
 - ▶ Values in the left subtree are smaller than the current node
 - ▶ Values in the right subtree are bigger than the current node

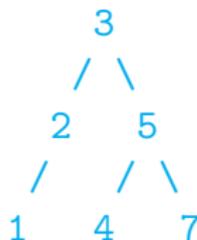
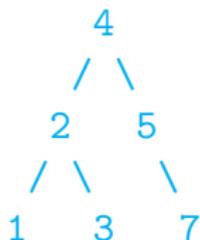
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Search trees

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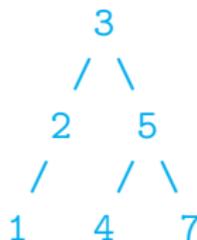
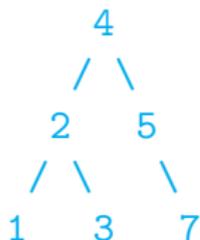


- ▶ Search Trees in Haskell

```
data Ord a => Stree a = Nil | Node (Stree a) a (Stree a)
  deriving (Eq, Show)
```

Search trees

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- ▶ Search Trees in Haskell

```
data Ord a => Stree a = Nil | Node (Stree a) a (Stree a)
  deriving (Eq, Show)
```

- ▶ Need `Ord a` to compare values
- ▶ No guarantee of being a search tree!

Search trees ...

- ▶ Is it a search tree?

Search trees ...

- ▶ Is it a search tree?

```
isstree :: Ord a => (Stree a) -> Bool
isstree Nil = True
isstree (Node tl y tr)
    = (isstree tl) && (isstree tr) &&
      (maxt tl < y) && (y < (mint tr))
```

Search trees ...

- ▶ Is it a search tree?

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isstree :: Ord a => (Stree a) -> Bool
isstree Nil = True
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mint (Node Nil v Nil) = v
mint (Node tl v tr) = min (mint tl) (min v (mint tr))
```

Search trees ...

- ▶ Is it a search tree?

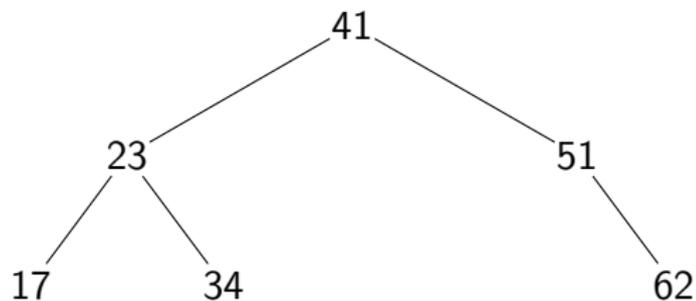
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- ▶ In how many ways is the above program incorrect?

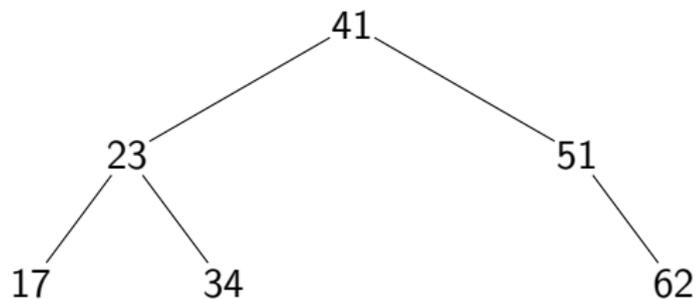
Search trees ...

- ▶ Searching for a value



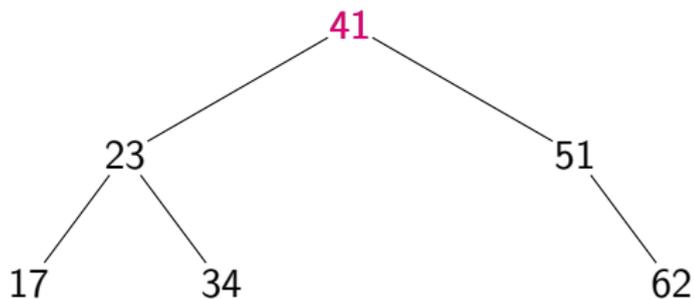
Search trees ...

- ▶ Searching for a value
Searching for 34



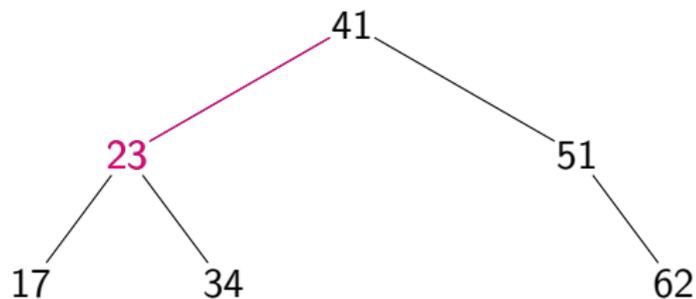
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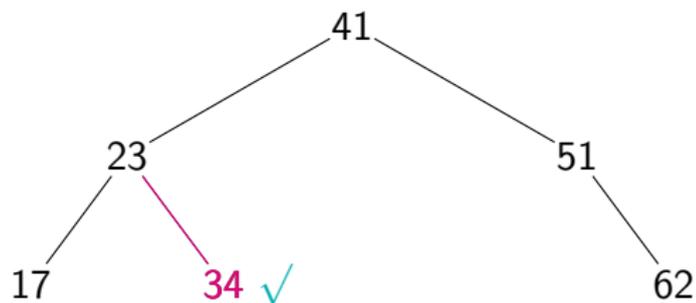
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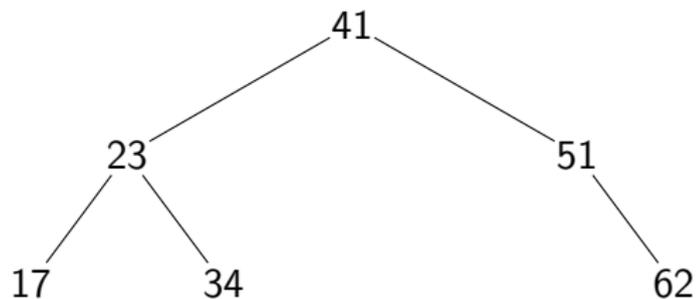
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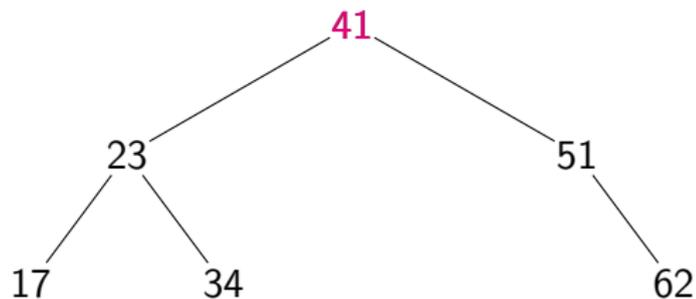
Search trees ...

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Searching for 49



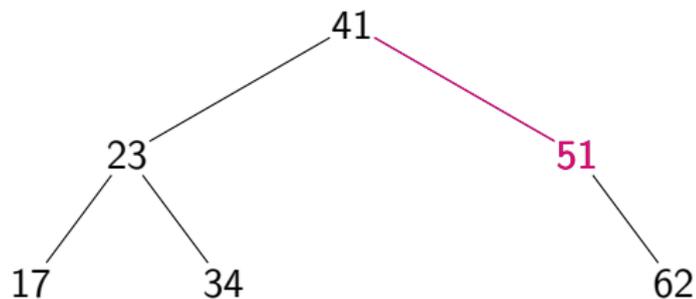
Search trees ...

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Searching for 49



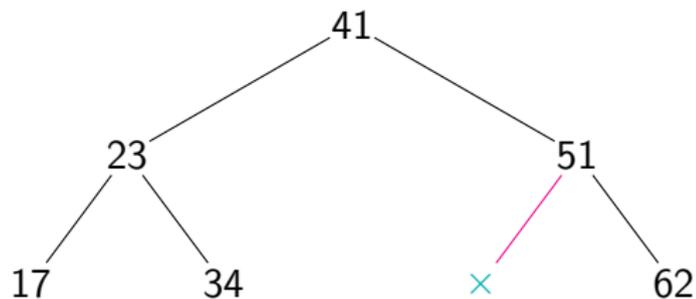
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Search trees ...

- ▶ Searching for a value v

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- ▶ Searching for a value v
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- ▶ At each node

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- ▶ Worst case: Number of steps is equal to the longest path from the root to a leaf

Search trees ...

- ▶ Searching for a value

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searchtree :: Ord a => (Stree a) -> a -> Bool
```

```
searchtree Nil v = False
```

```
searchtree (Node tl y tr) v
```

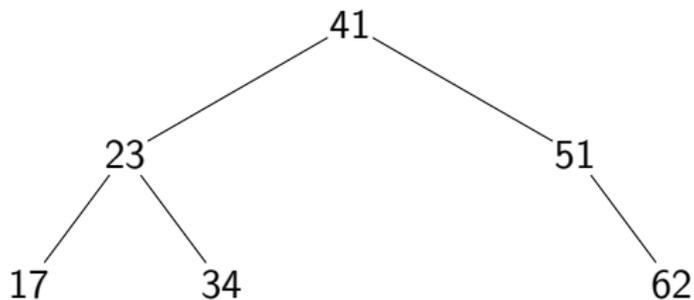
```
  | v == y      = True
```

```
  | v < y      = searchtree tl v
```

```
  | otherwise = searchtree tr v
```

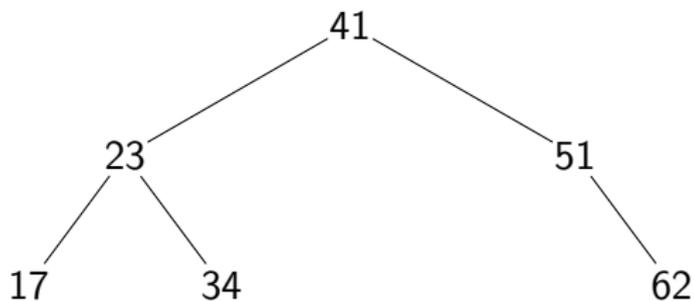
Search trees, inserting a value

- ▶ Insert a value



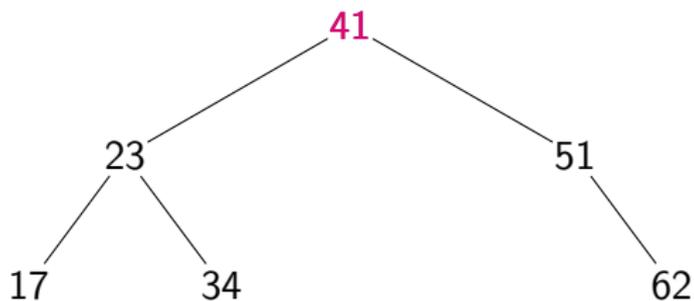
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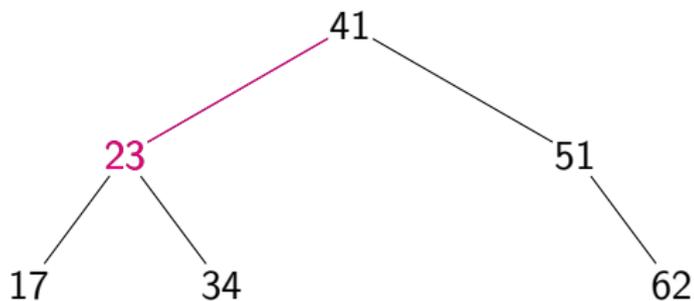
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Search trees, inserting a value

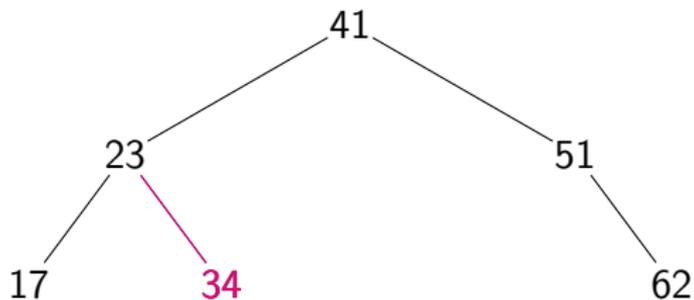
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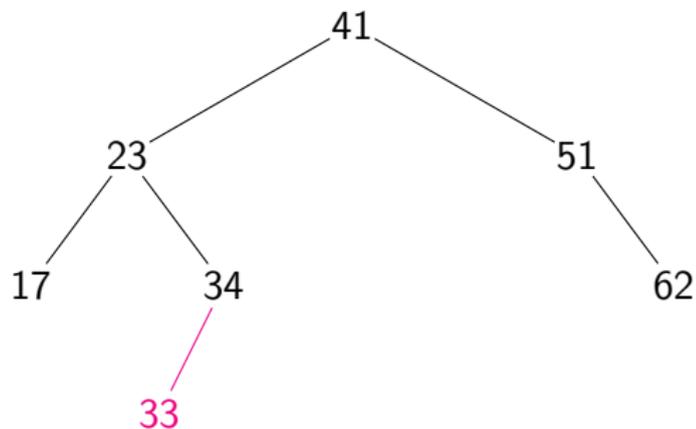
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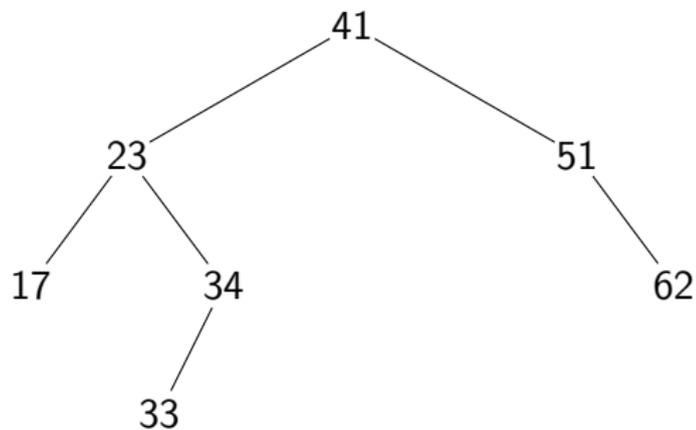
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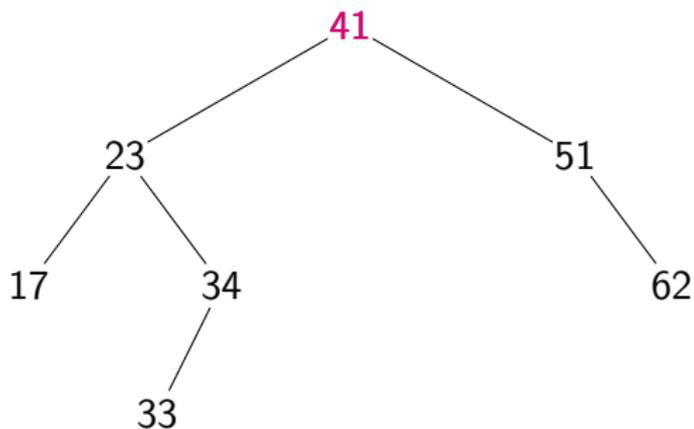
Search trees, inserting a value

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Insert 48



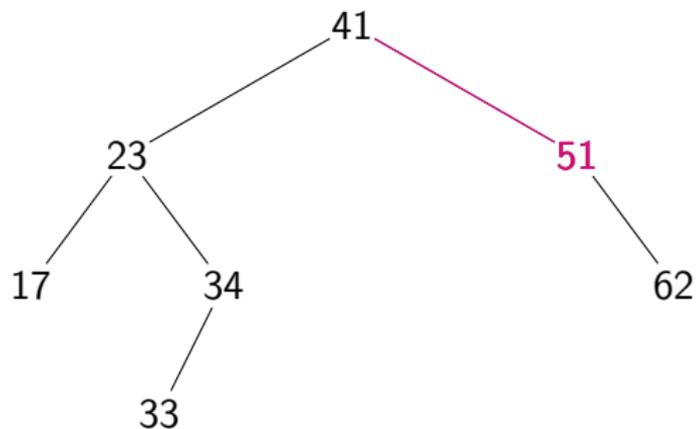
Search trees, inserting a value

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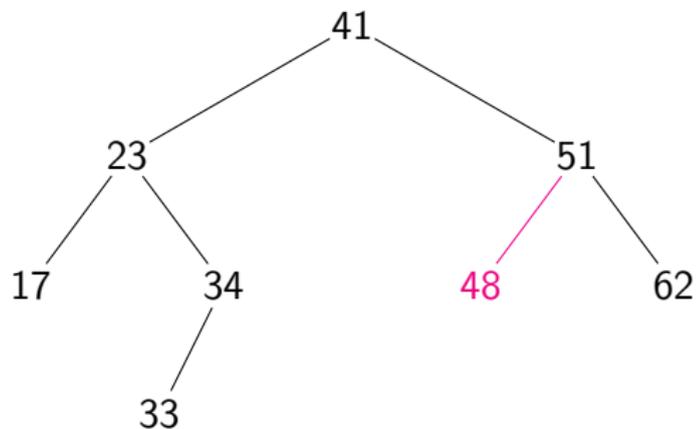
Search trees, inserting a value

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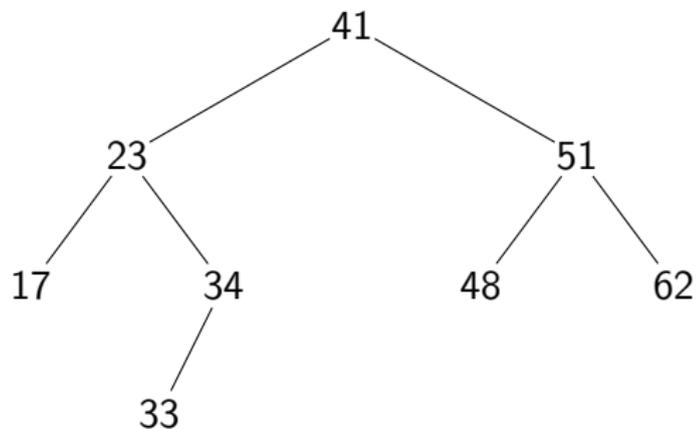
Search trees, inserting a value

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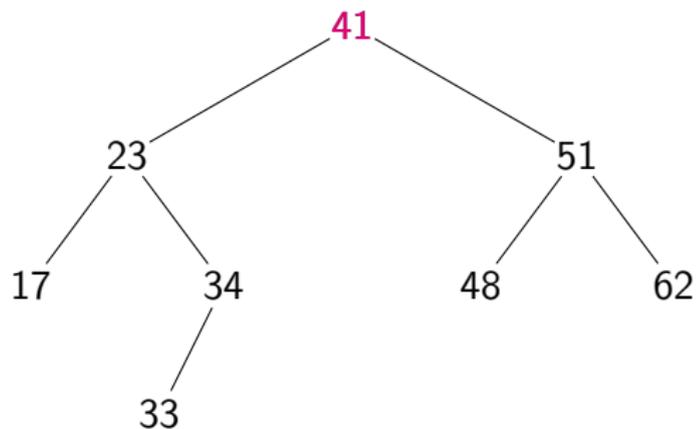
Search trees, inserting a value

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Insert 17



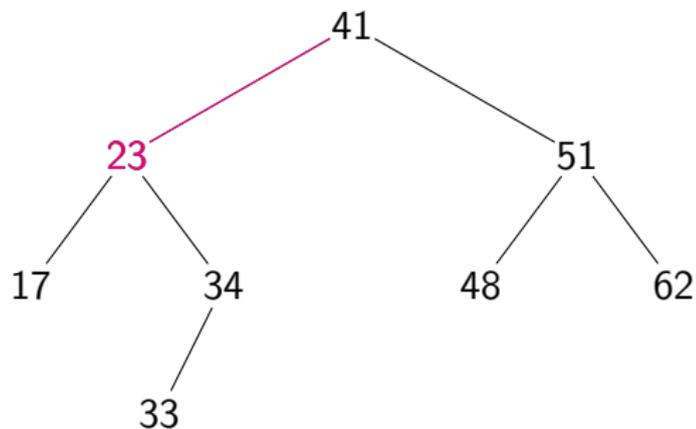
Search trees, inserting a value

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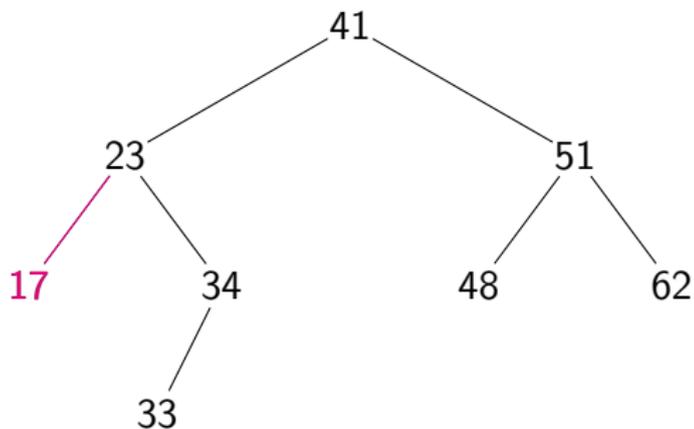
Search trees, inserting a value

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Search trees, inserting a value ...

- ▶ To insert a value v , find where it should be and add it if it is missing

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- ▶ At each node
 - ▶ If the value is found, exit

Search trees, inserting a value . . .

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 - ▶ Otherwise, add a right child with value v
- ▶ Worst case: Number of steps is equal to the longest path from the root to a leaf

Inserting into a search tree

- ▶ To insert a value, search for it to identify where it should go

```
inserttree :: Ord a => Stree a -> a -> Stree a
inserttree Nil v = Node Nil v Nil
inserttree (Node tl y tr) v
  | v == y      = Node tl y tr
  | v < y      = Node (inserttree tl v) y tr
  | otherwise  = Node tl y (inserttree tr v)
```

- ▶ `inserttree` returns the tree with the value inserted.

Search trees, deleting a value

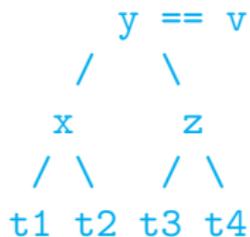
- ▶ Deleting v from a tree

Search trees, deleting a value

- ▶ Deleting v from a tree
- ▶ If v does not match current node, inductively delete from left or right subtree

Search trees, deleting a value

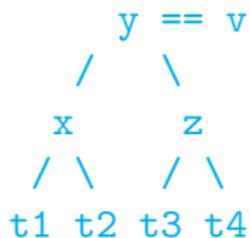
- ▶ Deleting v from a tree
- ▶ If v does not match current node, inductively delete from left or right subtree
- ▶ What if v does match?



- ▶ What value should replace y ?

Search trees, deleting a value

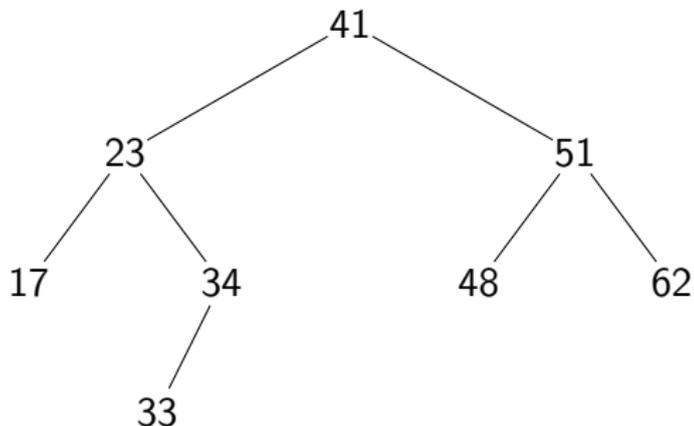
- ▶ Deleting v from a tree
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- ▶ What value should replace y ?
- ▶ Cannot blindly shift up x or z

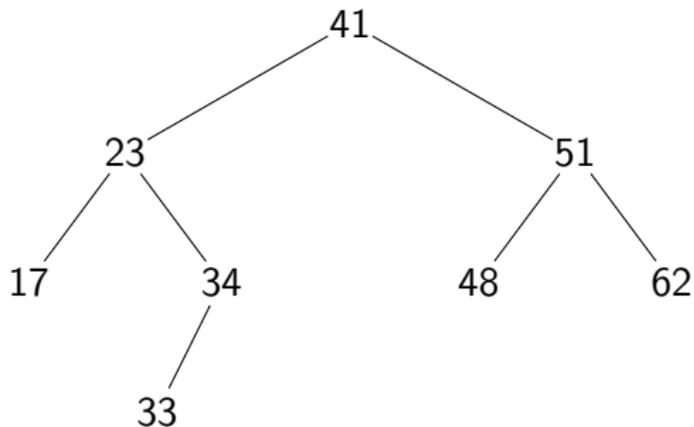
Search trees, deleting a value ...

- ▶ Delete a value



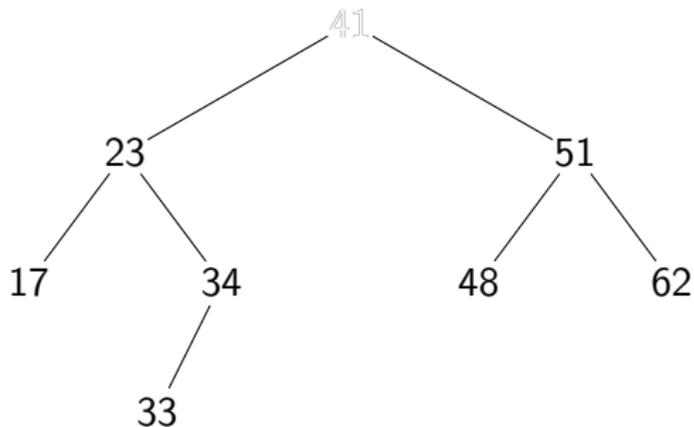
Search trees, deleting a value ...

- ▶ Delete a value
Delete 41



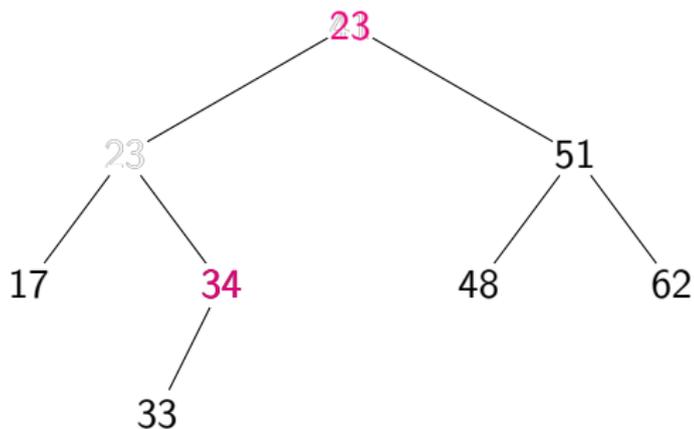
Search trees, deleting a value ...

- ▶ Delete a value
Delete 41



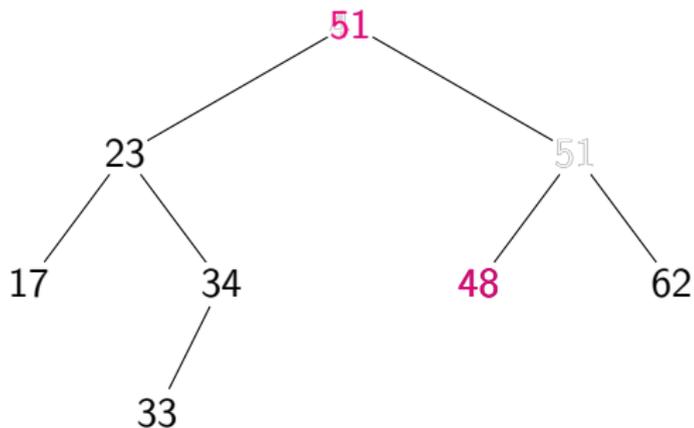
Search trees, deleting a value ...

- ▶ Delete a value
Delete 41
Cannot shift up 23

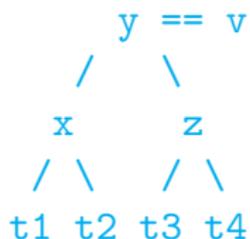


Search trees, deleting a value ...

- ▶ Delete a value
Delete 41
Cannot shift up 51



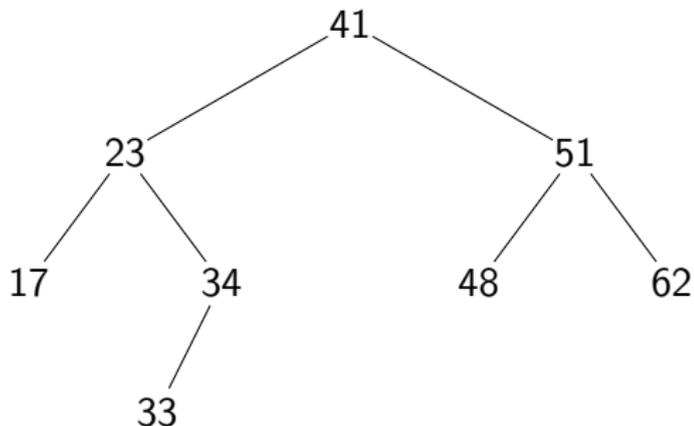
Search trees, deleting a value ...



- ▶ Cannot blindly shift up x or z
- ▶ Need to move up a value that is bigger than left and smaller than right
 - ▶ Move up maximum value in left subtree ...
 - ▶ ...or minimum value in right subtree

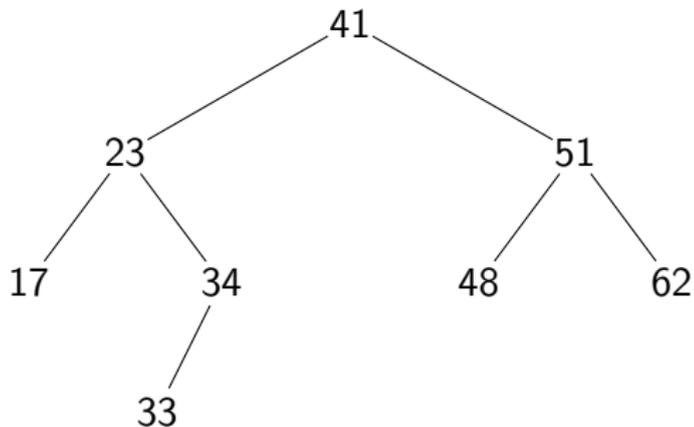
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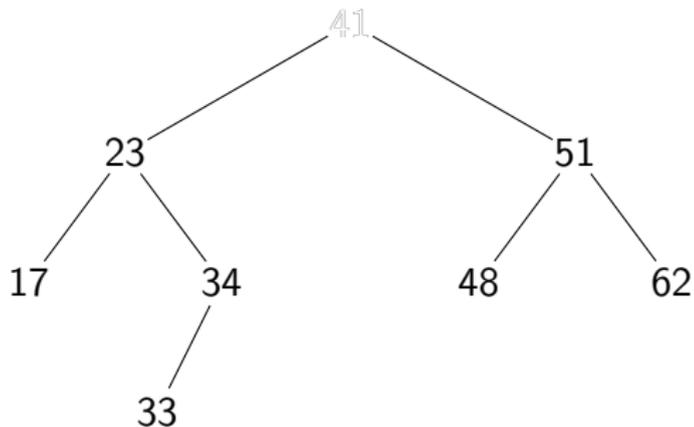
Search trees, deleting a value ...

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Search trees, deleting a value ...

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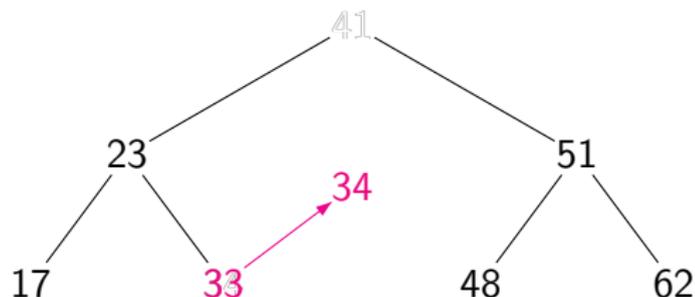


Search trees, deleting a value ...

- ▶ Delete a value

Delete 41

Remove maximum value in left subtree, 34



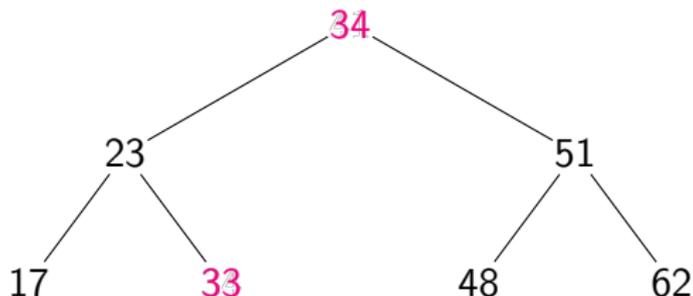
Search trees, deleting a value ...

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Remove maximum value in left subtree, 34

... and use it to replace 41



Search trees ...

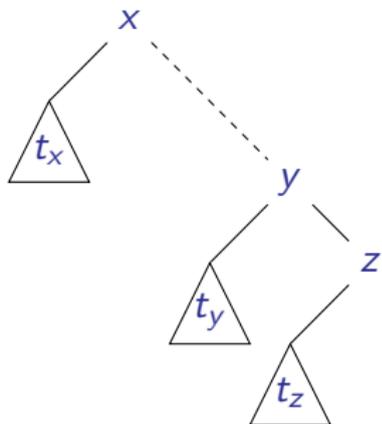
- ▶ Deleting the maximum value in a search tree

Search trees ...

- ▶ Deleting the maximum value in a search tree
- ▶ Keep going **right** till you run out of values
 - ▶ Rightmost value has no right subtree
 - ▶ Replace rightmost value by its left subtree

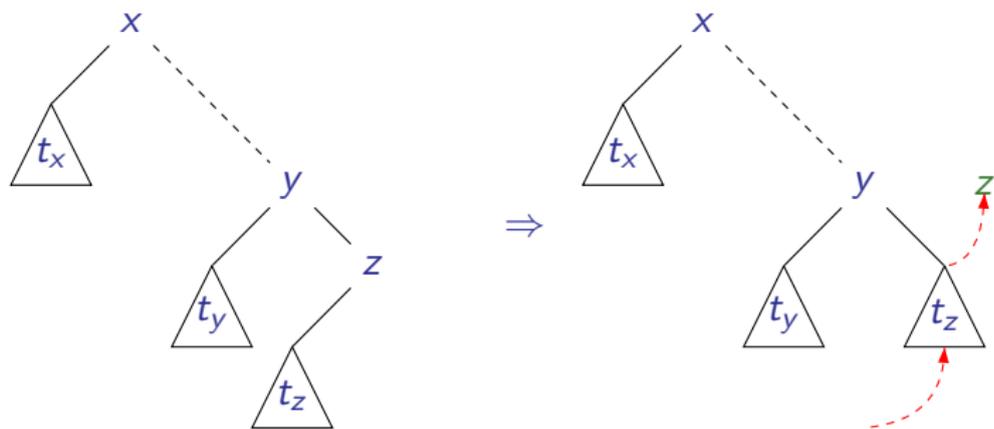
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Deleting maximum value in a search tree ...

► deletemax

```
deletemax :: Ord a => Stree a -> (a ,Stree a)
```

```
-- We are at rightmost value
```

```
deletemax (Node t1 y Nil) = (y,t1)
```

```
-- We are not yet at rightmost value
```

```
deletemax (Node t1 y t2) = (z, Node t1 y tz)  
  where (z,tz) = deletemax t2
```

Deleting maximum value in a search tree ...

- ▶ `deletemax`

```
deletemax :: Ord a => Stree a -> (a ,Stree a)
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```
-- We are at rightmost value
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deletemax (Node t1 y Nil) = (y,t1)
```

```
-- We are not yet at rightmost value
```

```
deletemax (Node t1 y t2) = (z, Node t1 y tz)
  where (z,tz) = deletemax t2
```

- ▶ Note that `deletemax` returns the maximum value and the modified tree

Search trees, deleting a value ...

- ▶ To delete a value v

Search trees, deleting a value ...

- ▶ To delete a value ✓
- ▶ Start at the root

Search trees, deleting a value ...

- ▶ To delete a value ✓
- ▶ Start at the root
- ▶ At each node

Search trees, deleting a value ...

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Search trees, deleting a value . . .

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- ▶ At each node
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- ▶ Worst case: Number of steps is equal to the longest path from the root to a leaf

Deleting from a search tree

- ▶ `deletetree` — deletes a given value from the given tree and returns the resulting tree

```
deletetree :: Ord a => Stree a -> a -> Stree a
```

```
deletetree Nil v = Nil
```

```
deletetree (Node tl y tr) v
```

```
  | v < y    = Node (deletetree tl v) y tr
```

```
  | v > y    = Node  tl  y (deletetree tr v)
```

```
-- In all cases below, we must have v == y
```

```
deletetree (Node Nil y tr) v    = tr
```

```
deletetree (Node  tl y tr) v = Node  tx x tr
```

```
  where (x,tx) = deletemax tl
```

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- ▶ In general, a search tree will not be balanced
- ▶ Inserting values in ascending or descending order results in highly skewed tree



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- ▶ However, it is not easy to maintain size-balance.

Height-balanced trees

- ▶ Maintain height balanced trees instead of size-balanced trees.
 - ▶ **Height** of left subtree and height of right subtree differ by at most one at any node.

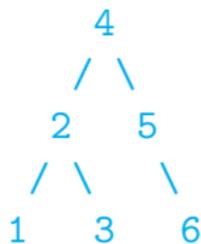
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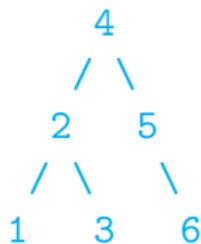
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- ▶ Somewhat easier to maintain.

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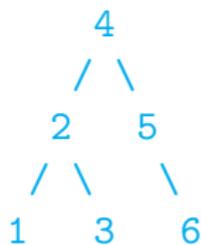


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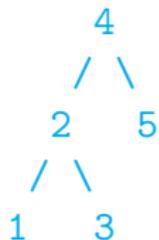


- ▶ A height and weight balanced tree.

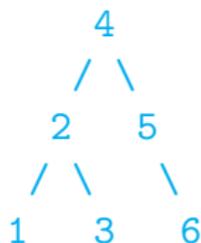
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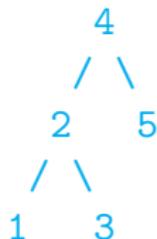
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- ▶ A height balanced tree that is not weight balanced.

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- ▶ Grows like the Fibonacci numbers, exponentially.
- ▶ $S(h) \geq 2^{h/1.44}$ or equivalently

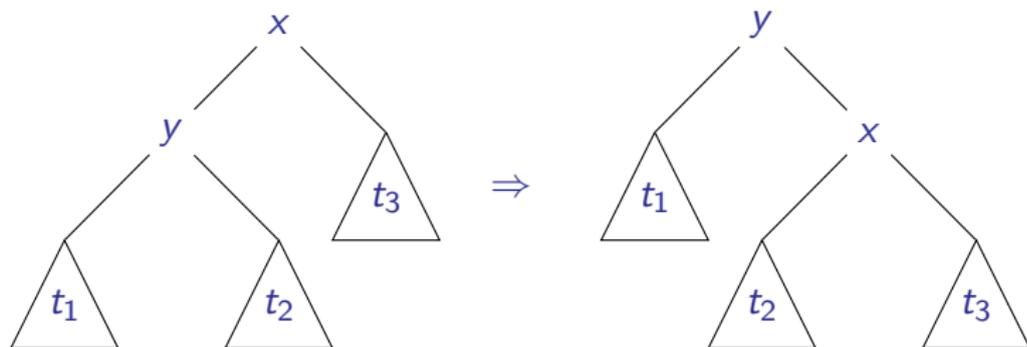
$$h(T) \leq 1.44 \log(s(T))$$

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- ▶ Use tree rotations to maintain height balance

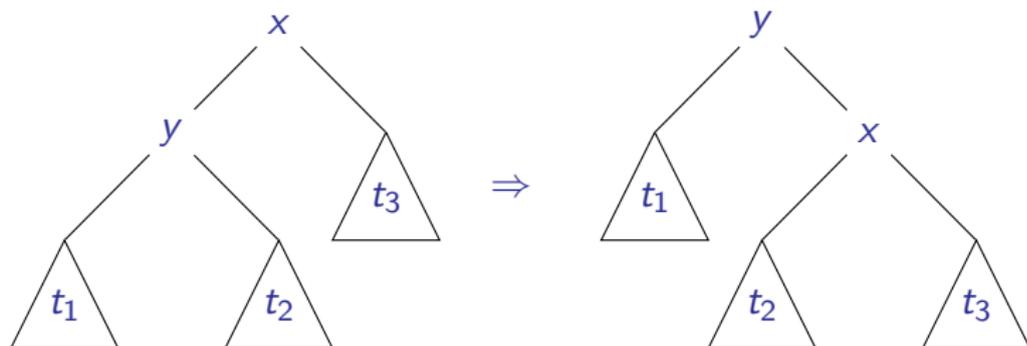
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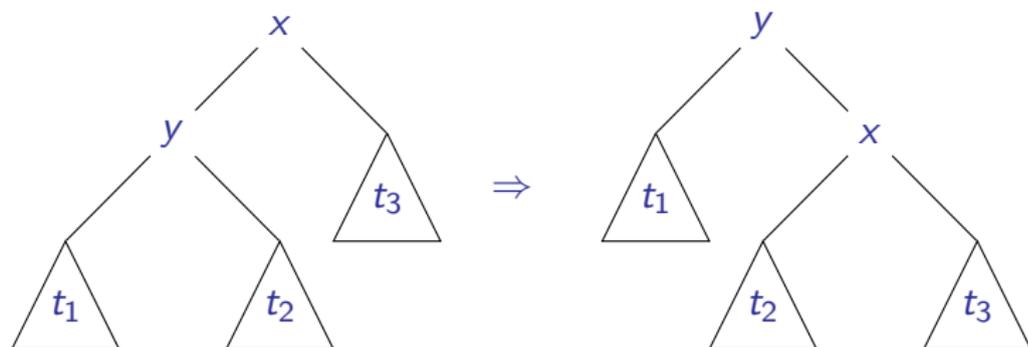
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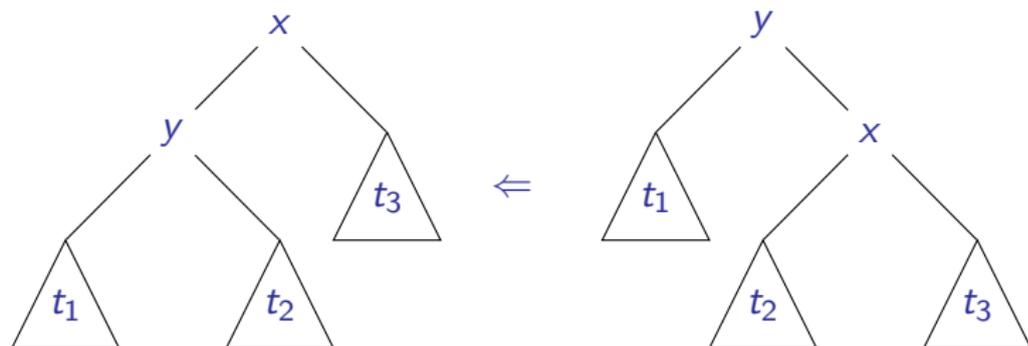
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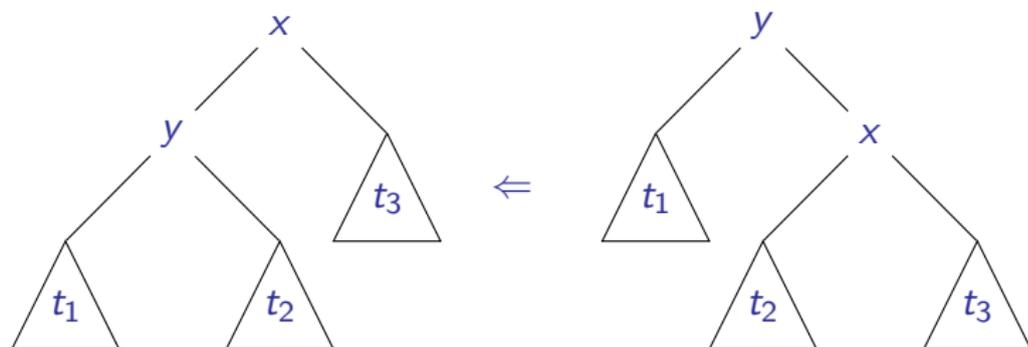
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- ▶ Useful if t_3 has large height.

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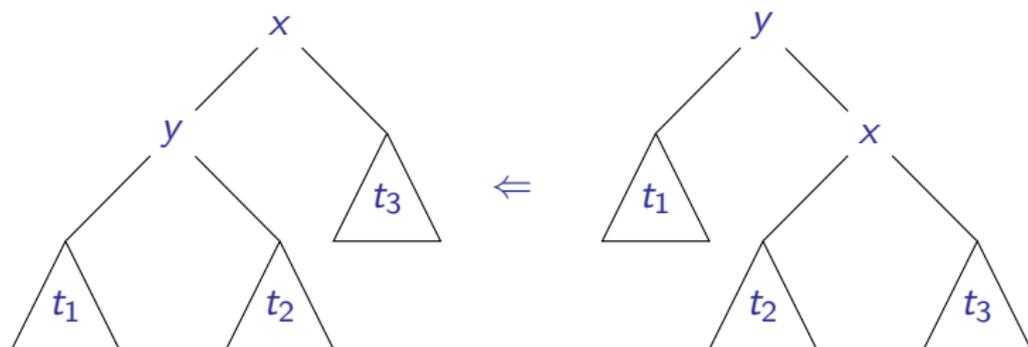
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