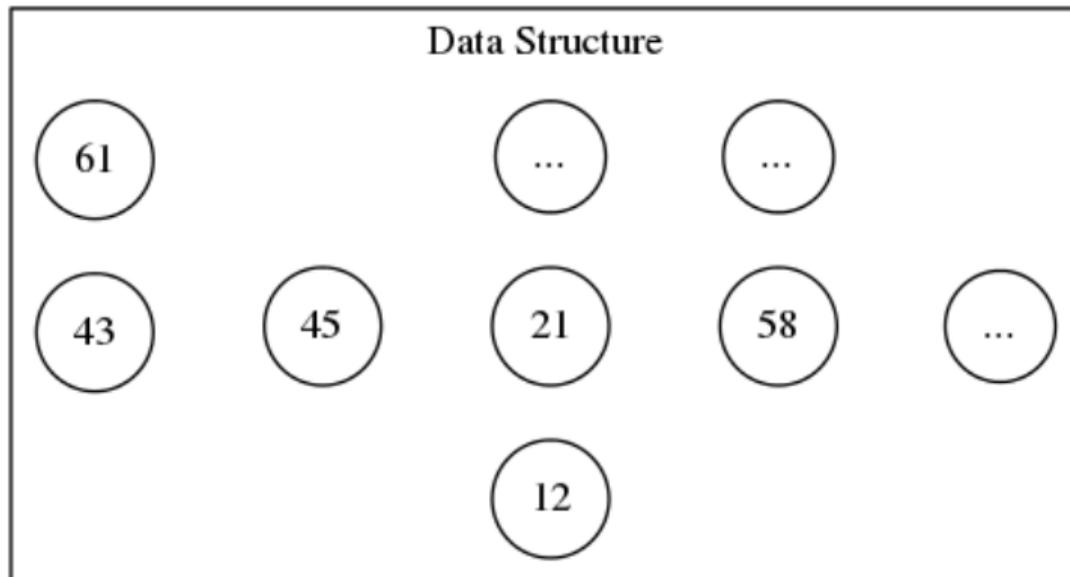




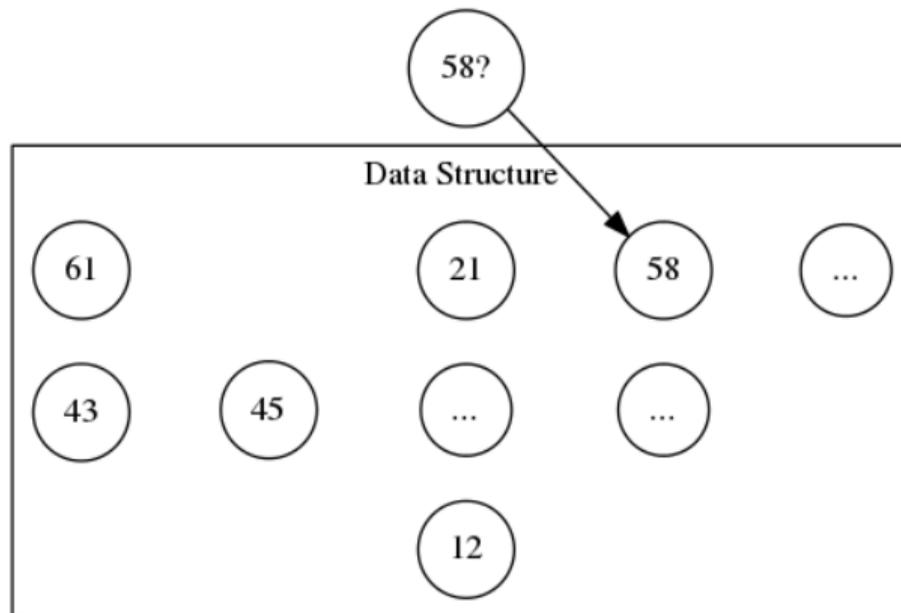
# Self-Adjusting Binary Search Trees

Andrei Pârnu

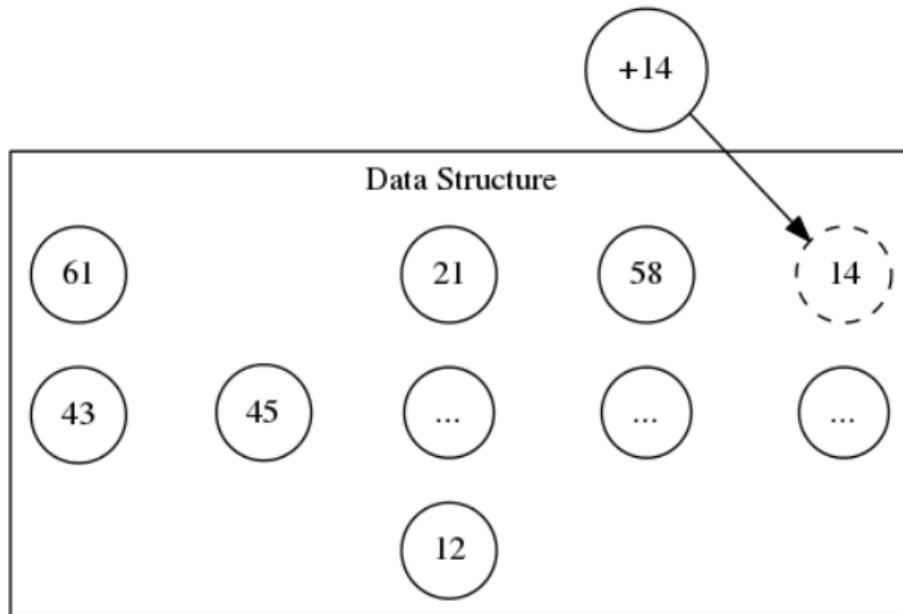
# Motivation



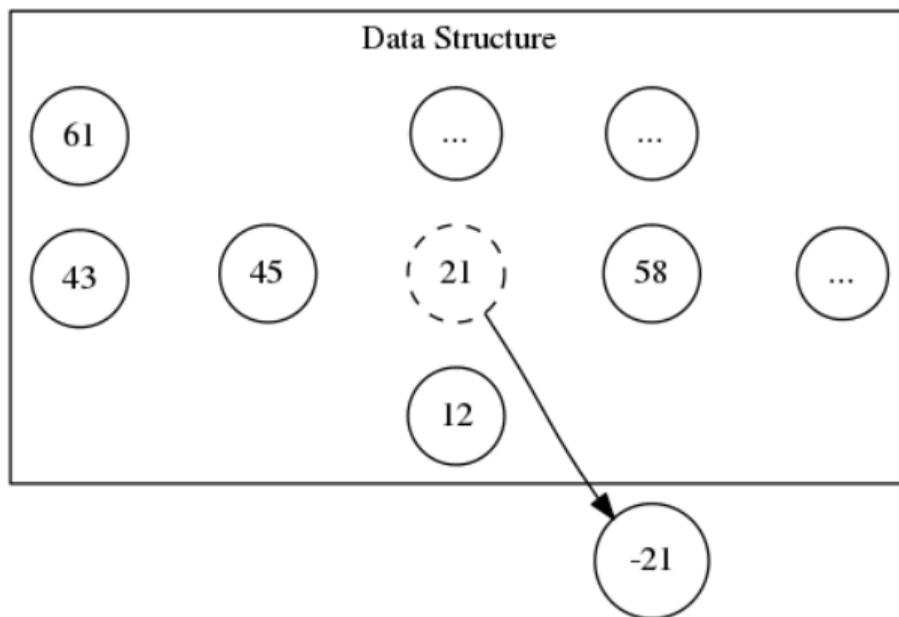
# Motivation: Find



# Motivation: Insert



## Motivation: Delete



**Goal:  $O(M * \log N)$  time complexity ( $N$  elements,  $M$  operations)**

# What is a Binary Search Tree?

- Binary tree :)

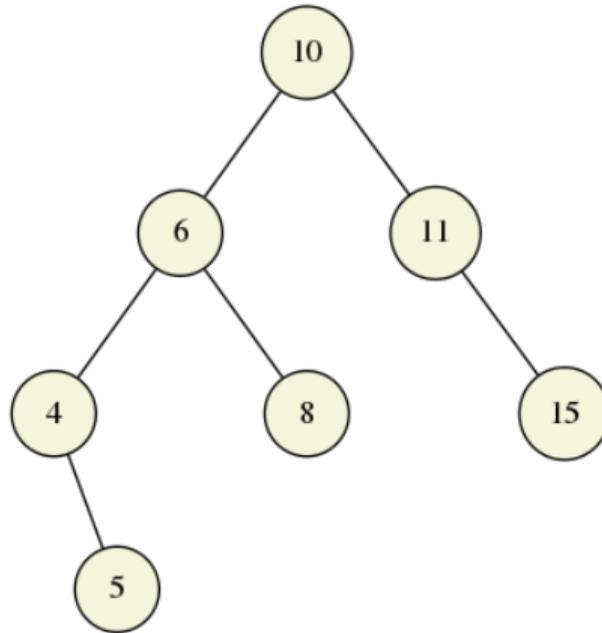
# What is a Binary Search Tree?

- Binary tree :)
- Each node stores an element (key)

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- Binary tree :)
- Each node stores an element (key)
- Key of a node:
  - is bigger than the keys of the left subtree
  - is smaller than the keys of the right subtree

# Example



## Operations: find element

- walk recursively down the tree

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- walk recursively down the tree
- if element equals with node key, stop

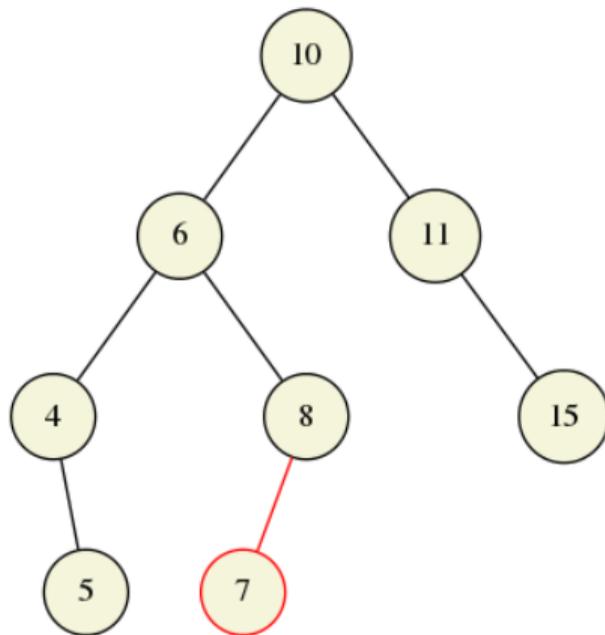
## Operations: find element

- walk recursively down the tree
- if element equals with node key, stop
- else
  - go to left child if element  $<$  than node key
  - go to right child if element  $>$  than node key

## Operations: insert element

- same algorithm as find
- add element as leaf

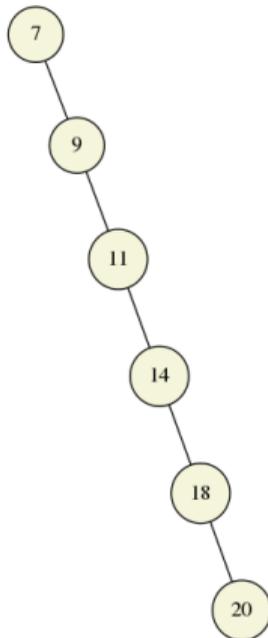
## Example: insert element



## Time complexity of operations

- if elements are chosen randomly, then  $O(M * \log N)$
- most of the time that is not the case :(

## Example linear tree



**How to make it faster?**

# Rotations

- rotate a node to the left or to the right

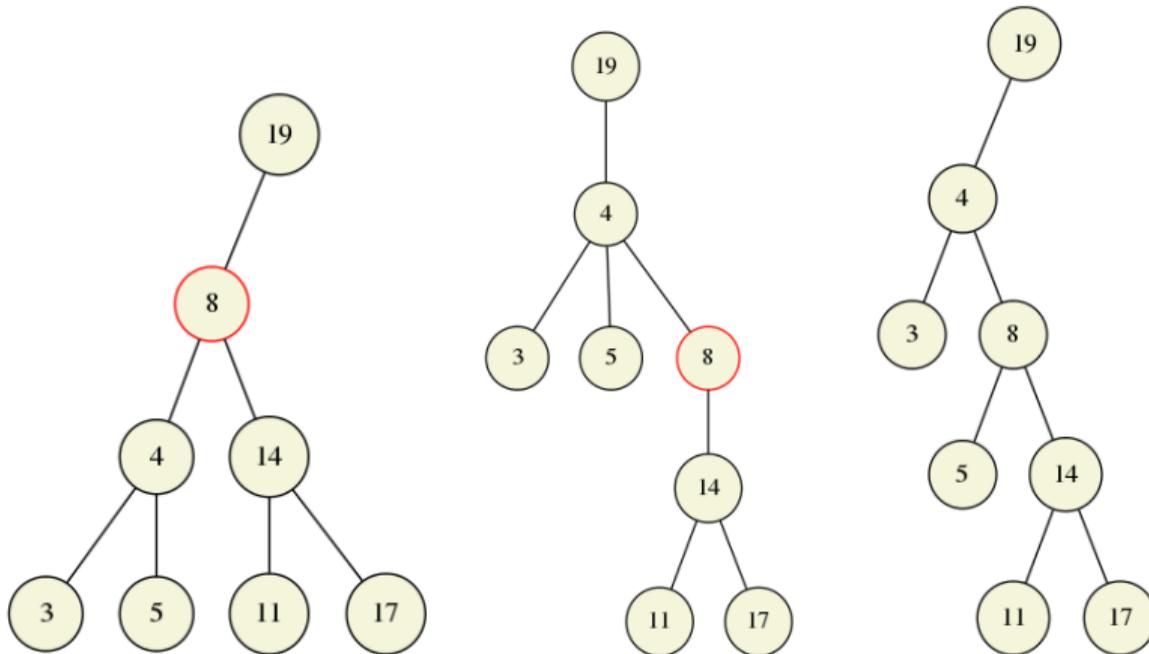
# Rotations

- rotate a node to the left or to the right
- maintain the BST invariant

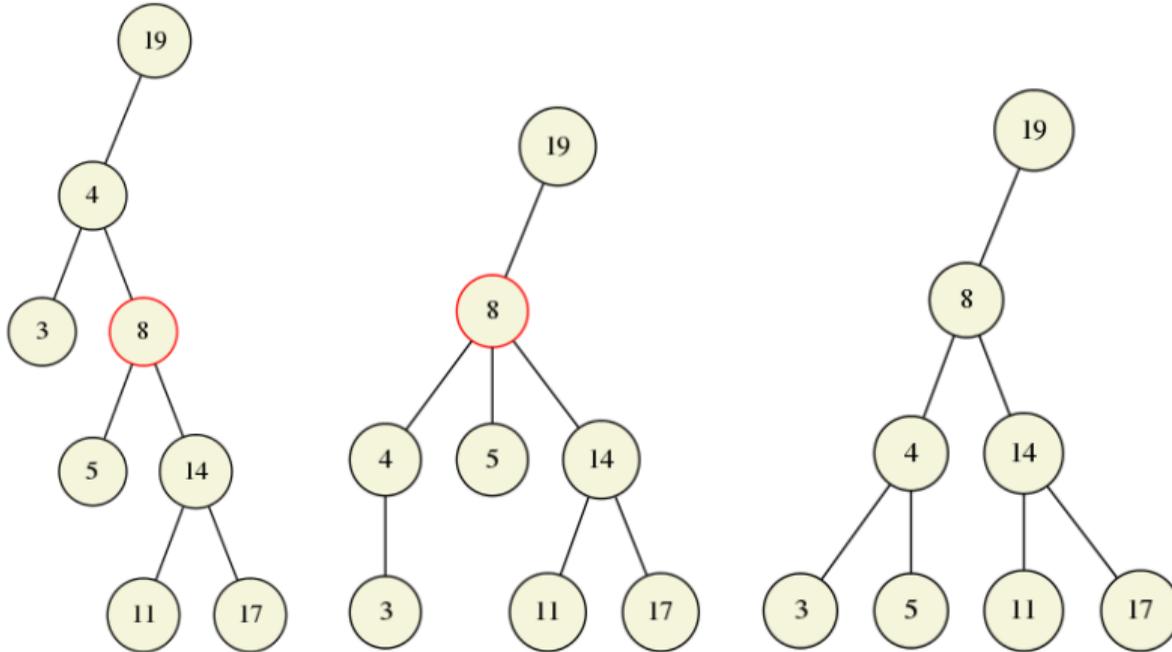
# Rotations

- rotate a node to the left or to the right
- maintain the BST invariant
- use them to modify the tree structure and maintain it balanced

## Example: rotation to the right



## Operations: rotation to the left



## How can we use rotations?

## Move to root heuristic

- after accessing an item at node  $x$ , rotate edge from  $x$  to its parent until  $x$  becomes root.
- **Does this improve anything?**

## Move to root heuristic

- after accessing an item at node  $x$ , rotate edge from  $x$  to its parent until  $x$  becomes root.
- **Does this improve anything?**
- **No, time of access can still be  $O(n)$**

# Splay tree

- BST with a restructuring heuristic, called splaying
- after inserting or finding an element, do pairs of rotations bottom-up

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- BST with a restructuring heuristic, called splaying
- after inserting or finding an element, do pairs of rotations bottom-up
- rotations depend on the structure of the path
- each pair of rotations shall be named a splaying step

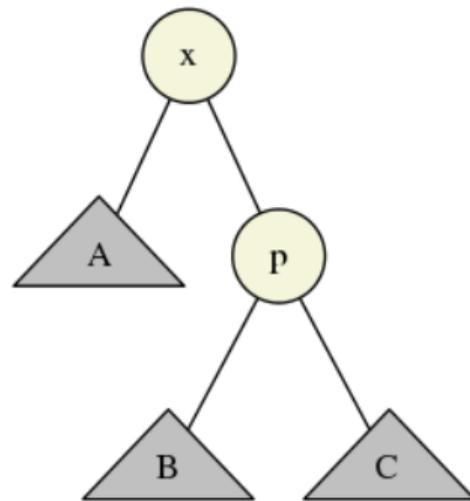
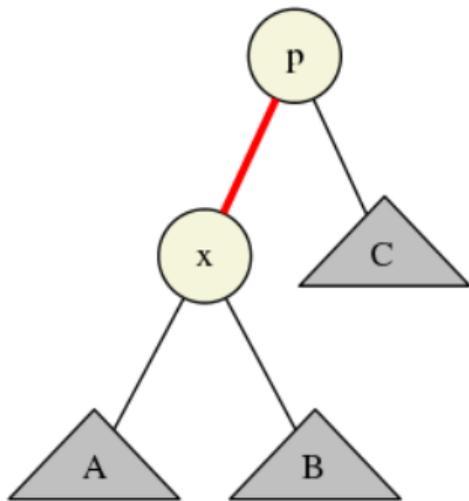
# Splay tree

- BST with a restructuring heuristic, called splaying
- after inserting or finding an element, do pairs of rotations bottom-up
- rotations depend on the structure of the path
- each pair of rotations shall be named a splaying step
- repeat splaying step on  $x$  until it is root

## Splaying step - case 1: zig

- if  $p(x)$ , parent of  $x$ , is root of tree, rotate edge joining  $x$  with  $p(x)$
- terminal case

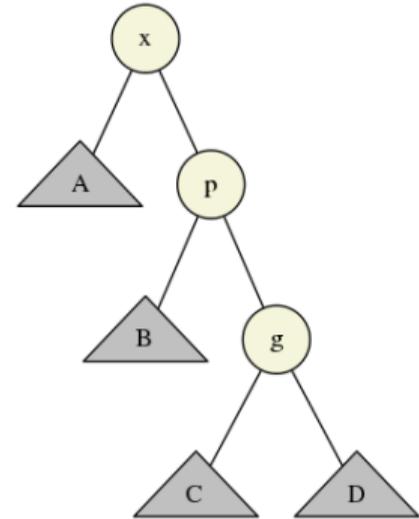
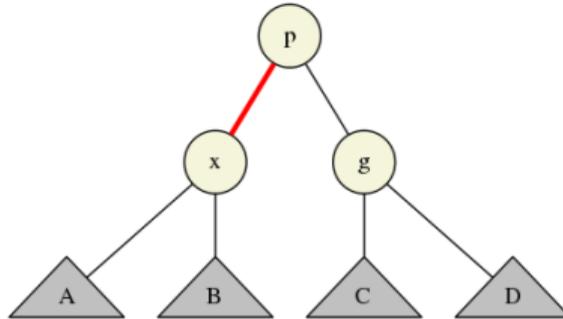
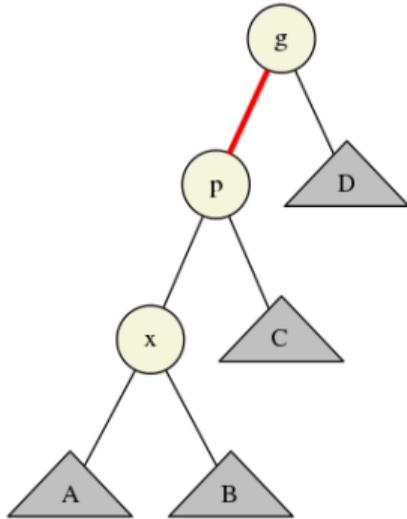
## Example: zig



## Splaying step - case 2: zig-zig

- $p(x)$  not the root
- $g(x)$  parent of  $p(x)$
- $x$  and  $p(x)$  both right-children or both left-children
- rotate edge joining  $p(x)$  with  $g(x)$
- rotate edge joining  $p(x)$  with  $x$

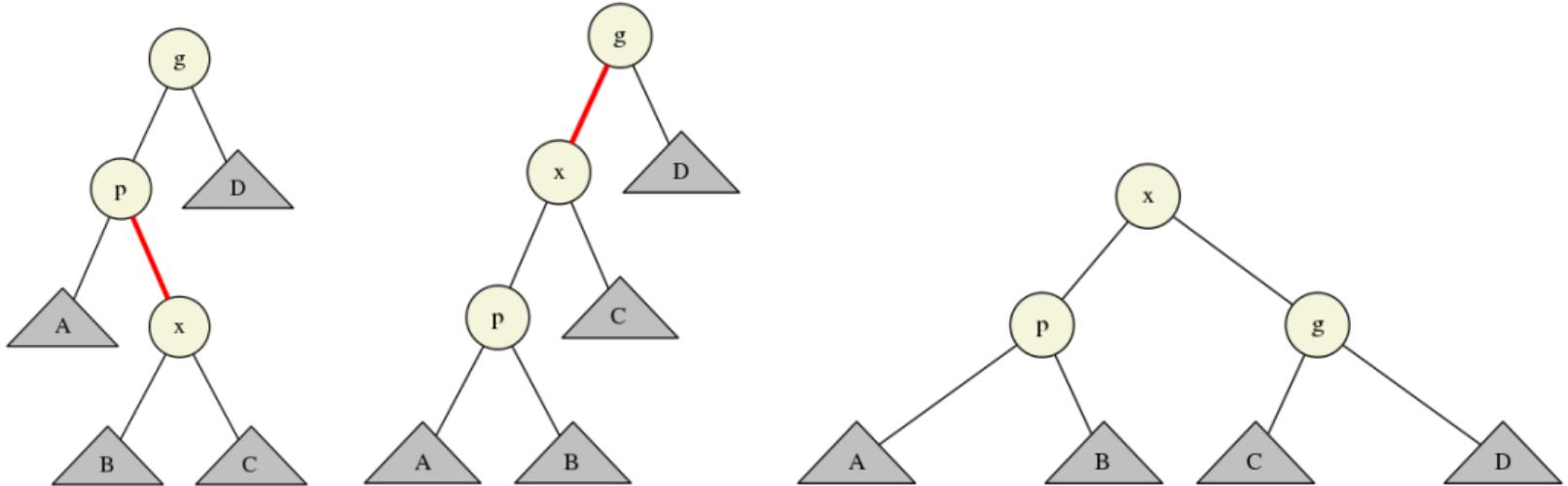
# Example: zig-zig



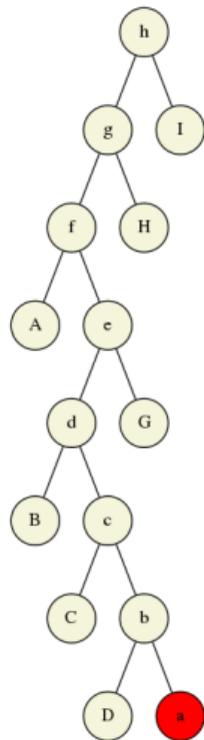
## Splaying step - case 3: zig-zag

- $p(x)$  not the root
- $g(x)$  parent of  $p(x)$
- $x$  left child and  $p(x)$  right child or vice-versa
- rotate edge joining  $x$  with  $p(x)$
- rotate edge joining  $x$  with  $g(x)$

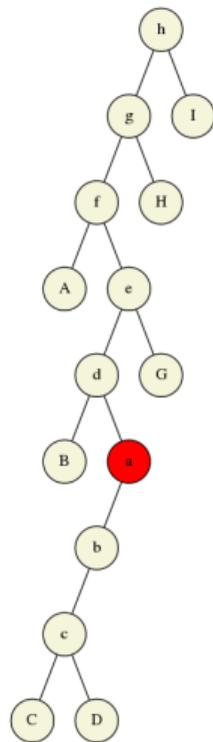
# Example: zig-zag



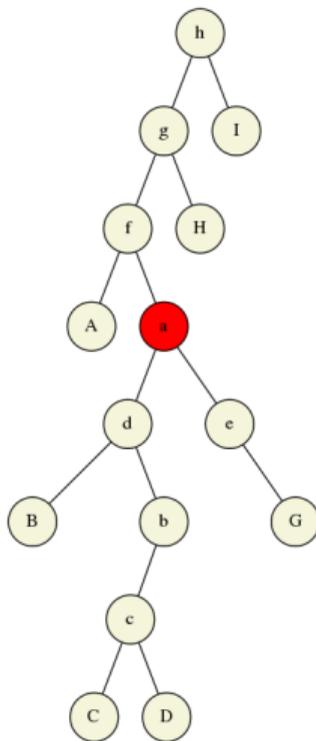
## Example: splaying on a node



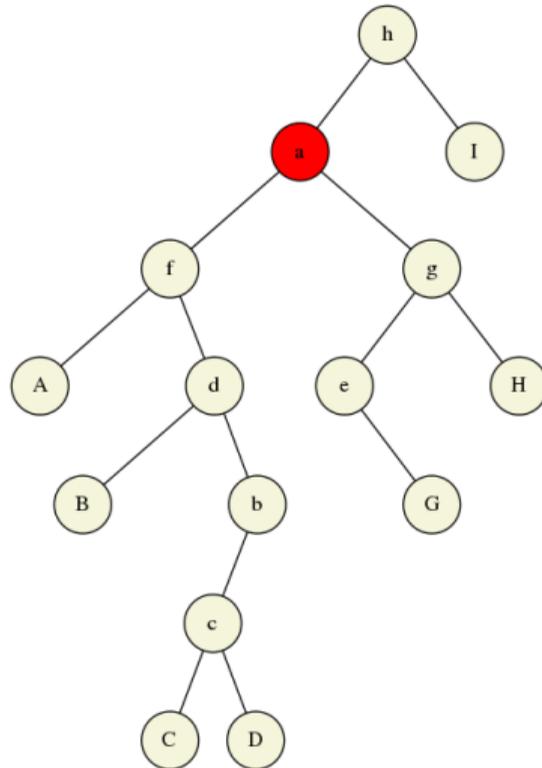
## Example: splaying on a node (1)



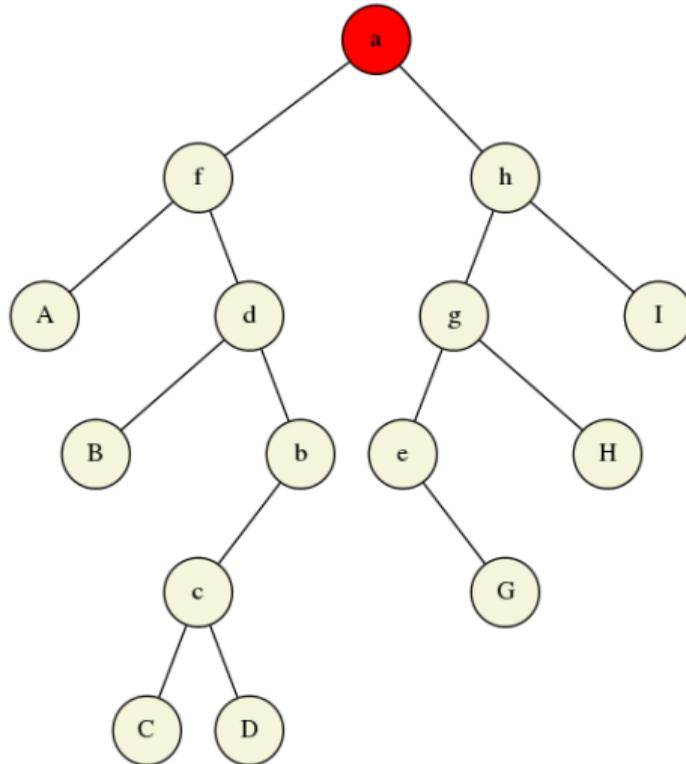
## Example: splaying on a node (2)



## Example: splaying on a node (3)



## Example: splaying on a node (4)



# Complexity & Analysis

- Why is splaying better than *move to root* heuristic?

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- Why is splaying better than *move to root* heuristic?
- if a node is at depth  $d$  on the splaying path, it will be at about  $d/2$  after the splay
  - except the root, its child and the splayed node

## Complexity & Analysis II

- use the *potential method*
- $\Phi(T)$  = extra time that can be later consumed on tree  $T$
- from  $T$  to  $T'$  amortized time = *actual\_time* +  $\Phi(T') - \Phi(T)$

## Complexity & Analysis II

- amortized time =  $actual\_time + \Phi(T') - \Phi(T)$
- if  $actual\ time < amortized\ time$ , increase potential
- if  $actual\ time > amortized\ time$ , decrease potential

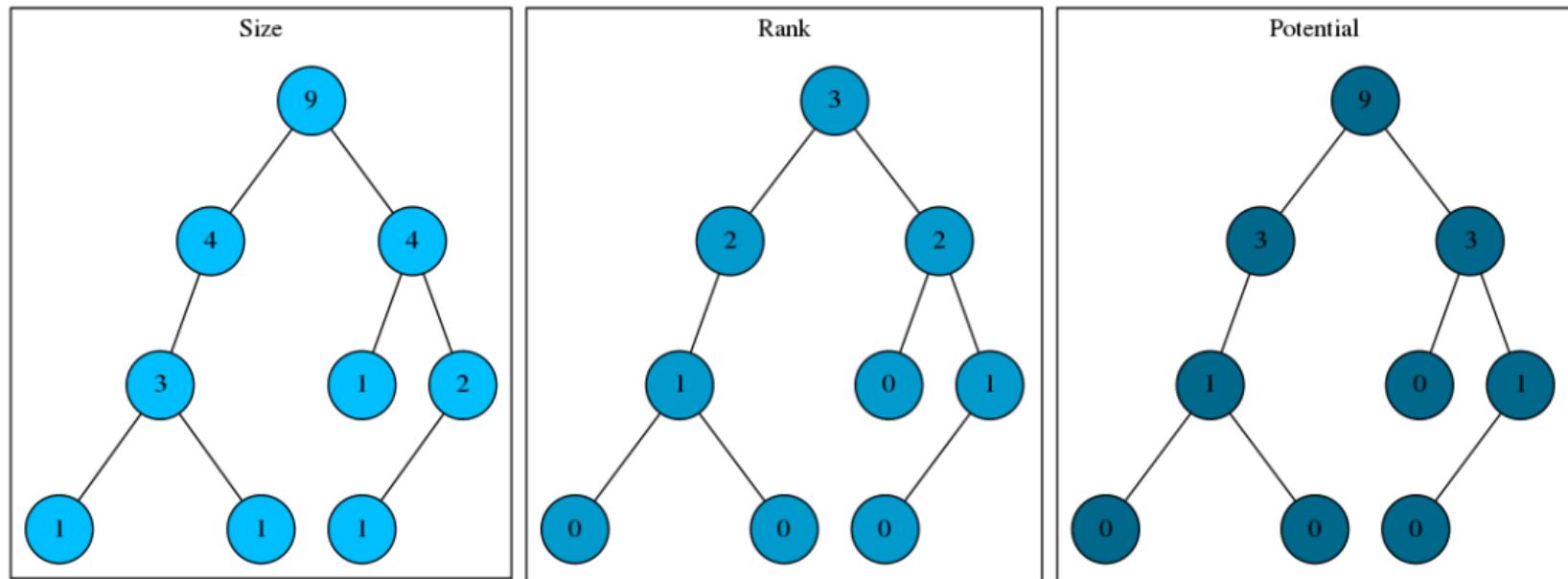
## Analysis on $M$ operations

$$t_1 + t_2 + \dots + t_M + (\Phi(T_1) - \Phi(T_0)) + (\Phi(T_2) - \Phi(T_1)) + \dots + (\Phi(T_M) - \Phi(T_{M-1})) = \\ t_1 + t_2 + \dots + t_M + \Phi(T_M) - \Phi(T_0).$$

## Potential function

- $size(x)$  = number of nodes in the subtree rooted at  $x$
- $rank(x) = \log_2(size(x))$
- $\Phi(T)$  = sum of *ranks* of nodes in subtree  $T$

# Potential function



## Potential splaying

- only  $x$ ,  $p(x)$  and  $g(x)$  change rank
- $\Delta\Phi = \text{rank}_i(g) - \text{rank}_{i-1}(g) + \text{rank}_i(x) - \text{rank}_{i-1}(x) + \text{rank}_i(p) - \text{rank}_{i-1}(p)$
- $\text{actual\_cost} + \Delta\Phi \leq 3 * (\text{rank}_i(x) - \text{rank}_{i-1}(x)) + 1$

## Complexity & Analysis III

- amortized time =  $actual\_cost + \Delta\Phi \leq 3 * (rank_i(x) - rank_{i-1}(x)) + 1$
- total time  $O(m * \log(n))$

# Analysis

## Pros:

- no additional information stored in nodes
- not that hard to implement

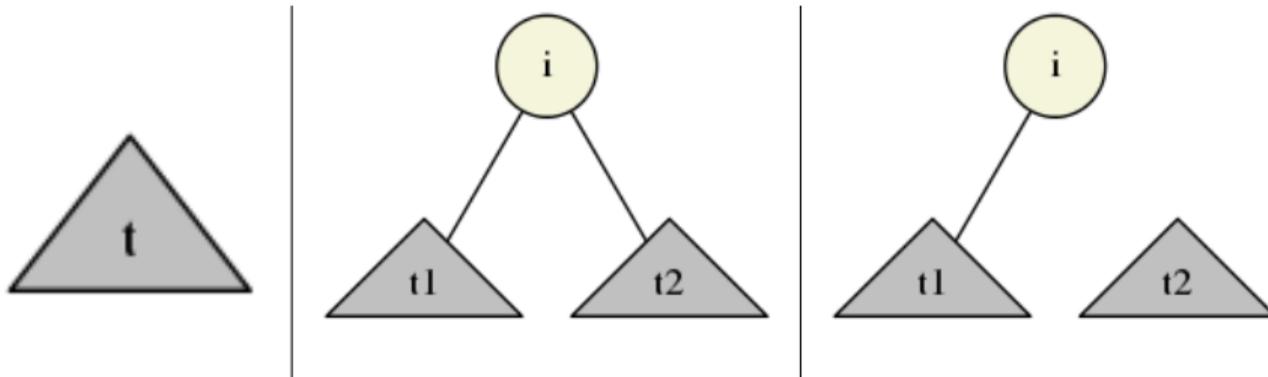
## Cons:

- at one point an operation can have  $O(n)$  time
- problems with multithreading

## Splitting a splay tree

- $\text{split}(i, t)$ : construct and return  $t_1$  and  $t_2$ 
  - elements in  $t_1$  smaller than  $i$
  - elements in  $t_2$  greater than  $i$
- **Ideas?**

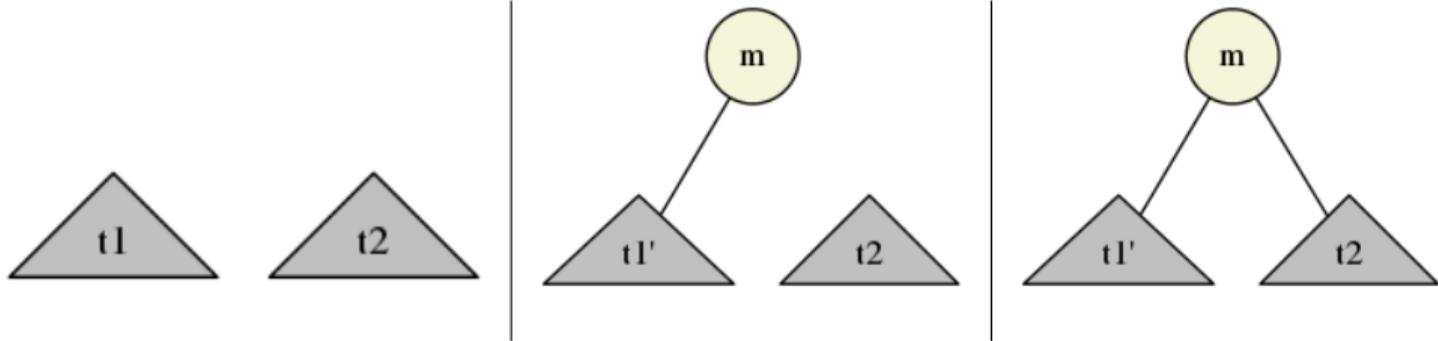
# How to split?



## Joining two splay trees

- $\text{join}(t_1, t_2)$ : combine  $t_1$  and  $t_2$  into single tree
  - elements in  $t_1$  smaller than elements in  $t_2$
- **Ideas?**

# How to join?

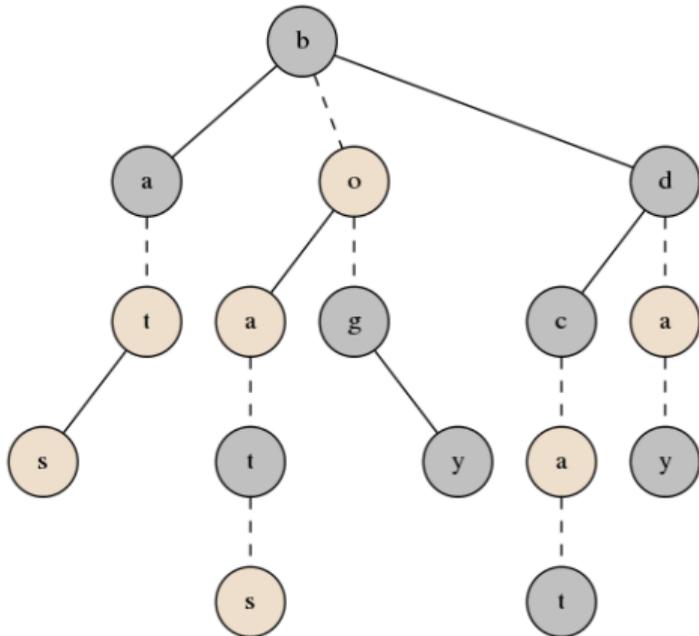


## **Applications: Lexicographic Search Tree**

# Lexicographic Search Tree

- store a set  $S$  of strings
- repeated access operations are efficient

## Example - Lexicographic Tree



boy

bog

as

at

cat

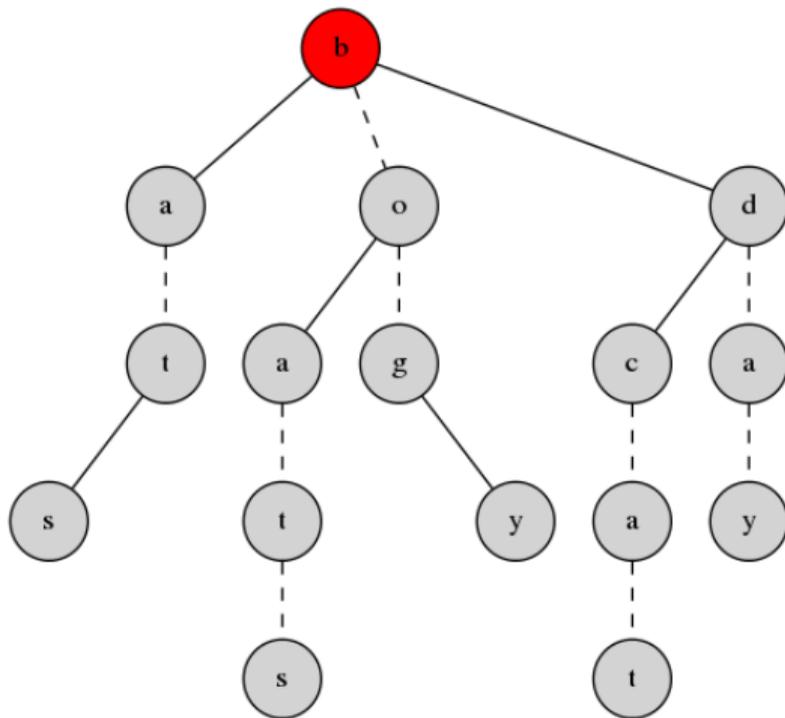
day

bats

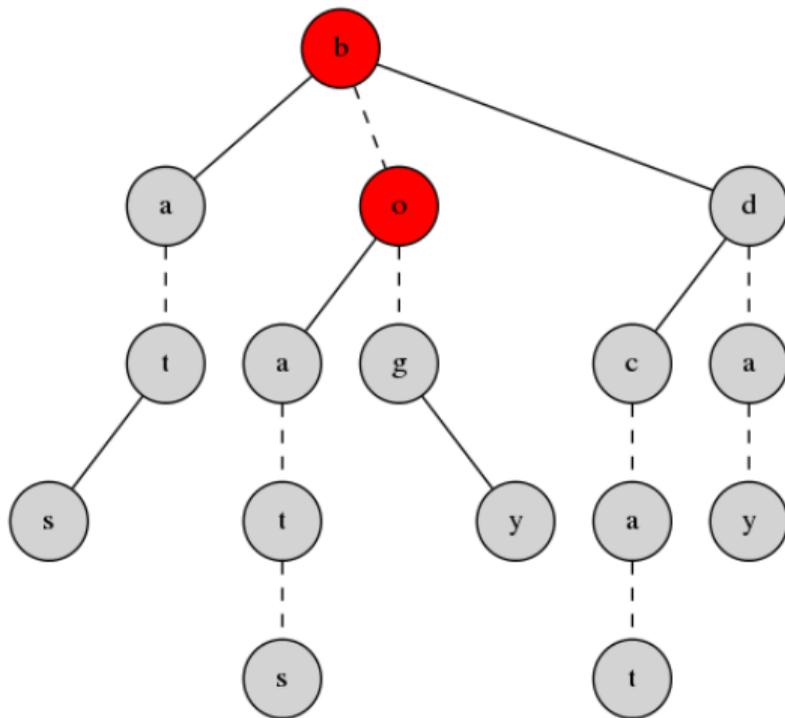
## Lexicographic Search Tree II

- ternary tree
- symbols in each node
- two types of edges
  - middle (dashed)
  - left & right
- nodes in the tree correspond to prefixes of strings:
  - concatenate symbols from which we leave by a dashed edge
- nodes connected by continuous edges form a binary search tree

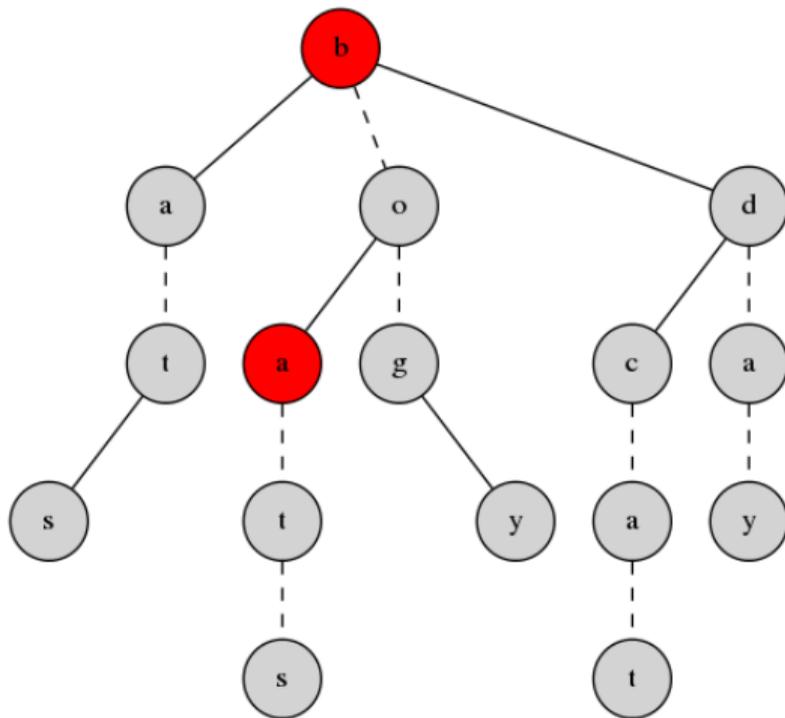
## Search for 'bats' (1)



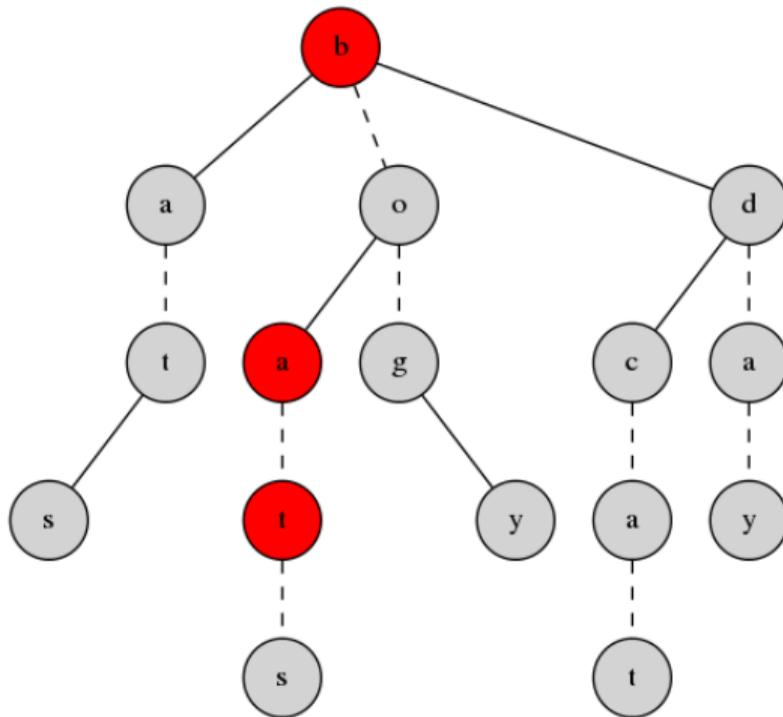
## Search for 'bats' (2)



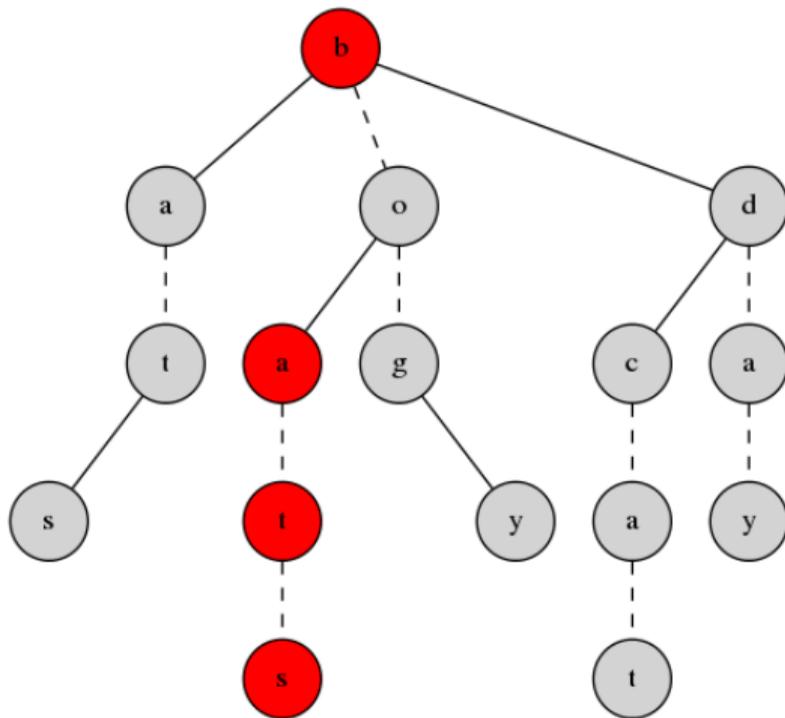
## Search for 'bats' (3)



## Search for 'bats' (4)



## Search for 'bats' (5)



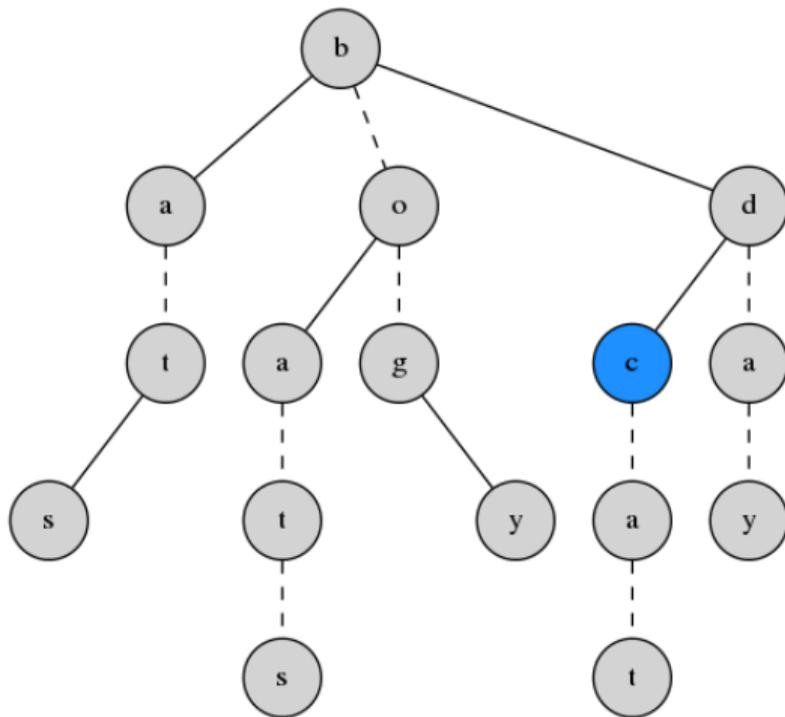
## Using splaying

- rotation rearranges left and right child, but not the middle props
- splay at node  $x$ :
  - similar with normal splay tree
  - if node is middle child, continue with  $p(x)$

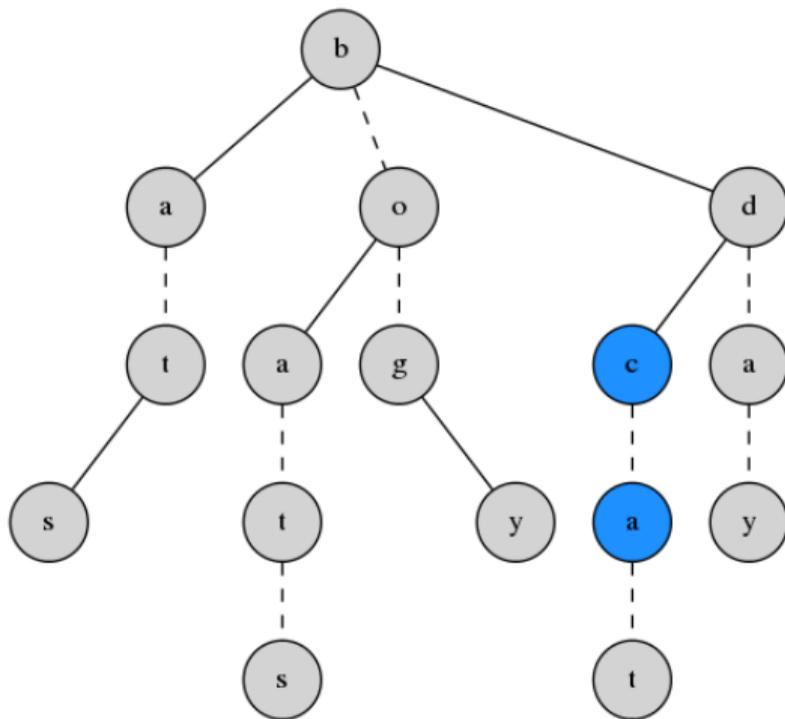
## Using splaying

- rotation rearranges left and right child, but not the middle props
- splay at node  $x$ :
  - similar with normal splay tree
  - if node is middle child, continue with  $p(x)$
- after splaying, path from root to  $x$  contains only dashed edges

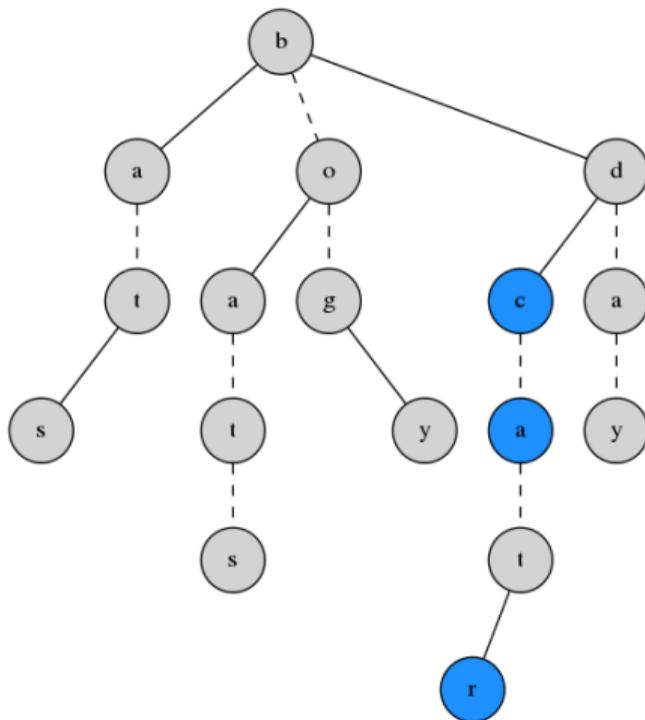
## Insert 'car'



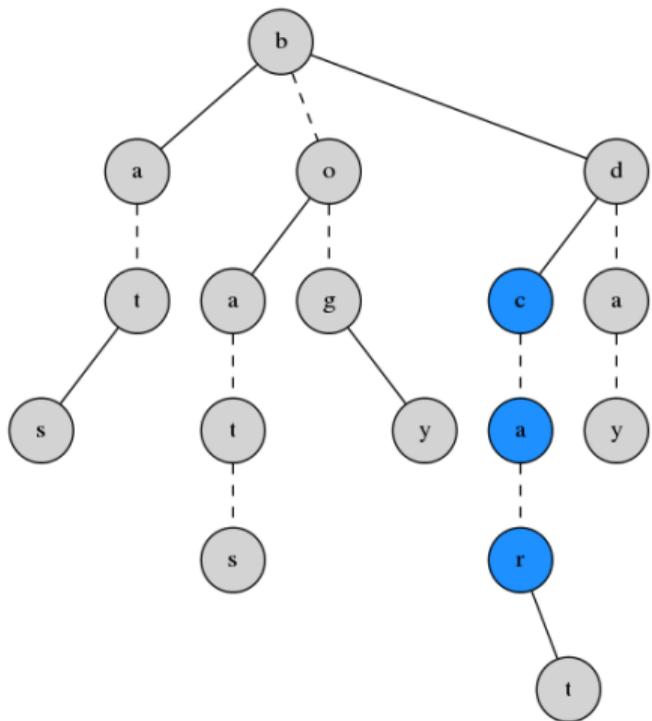
## Insert 'car' (2)



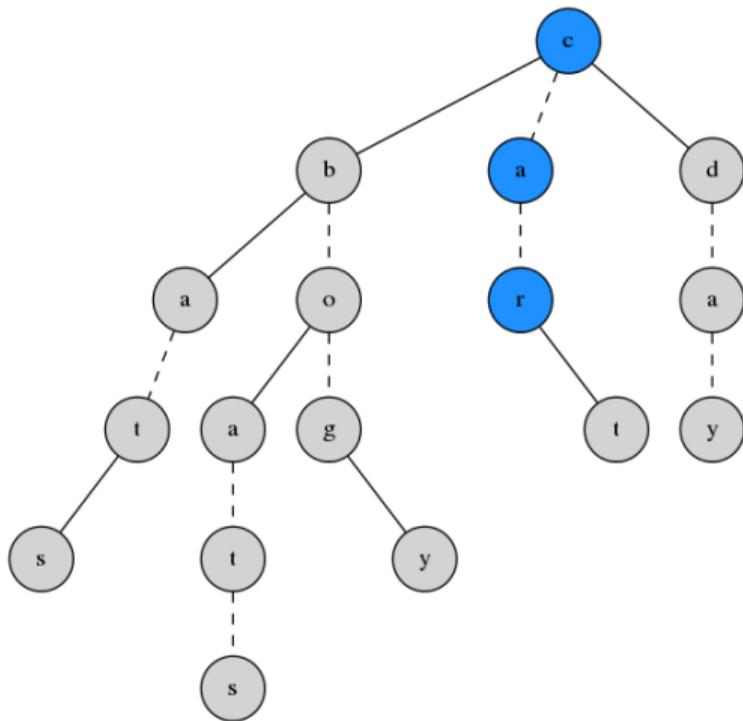
## Insert 'car' (3)



## Lex Tree splay



## Lex Tree splay



## Lex Tree analysis

- time of access is bounded by  $|\sigma|$  plus number of right and left edges traversed
- $O(|\sigma| + \log_2(N))$

## Application: Link-Cut Trees

# Link-Cut Trees

- abstract data structure for maintaining a forest of rooted trees
- the following operations should be supported
  - `find_root(v)`
  - `cut(v)`
  - `link(v, w)`

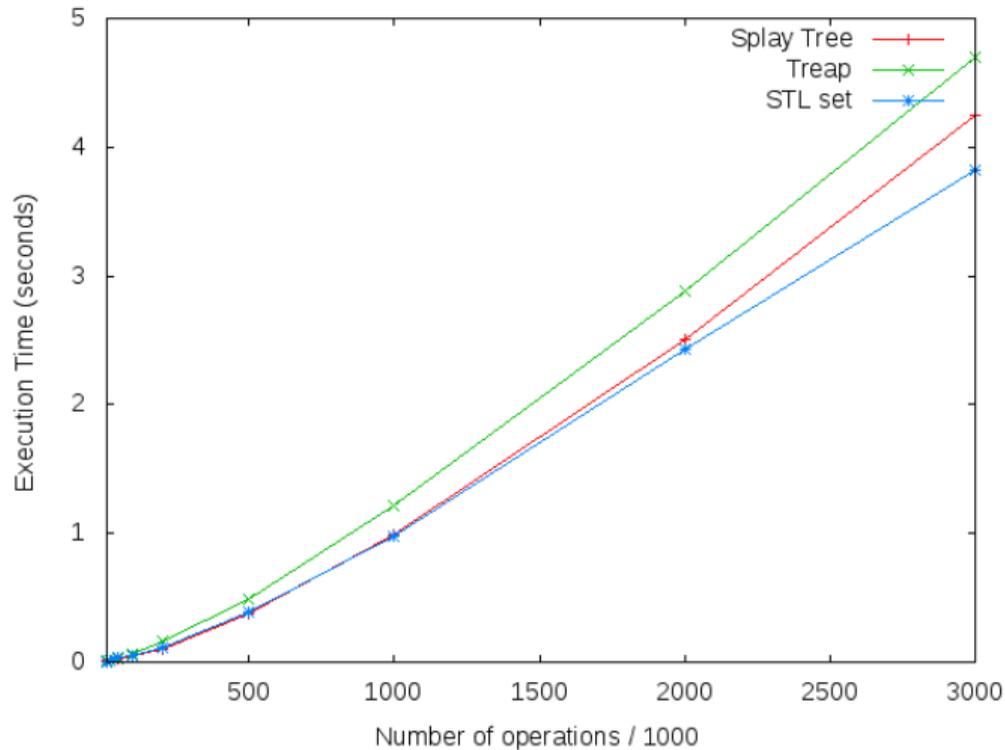
**Where are self-adjusting BSTs used?**

- Java (TreeMap, TreeSet) and C++ (set, map)

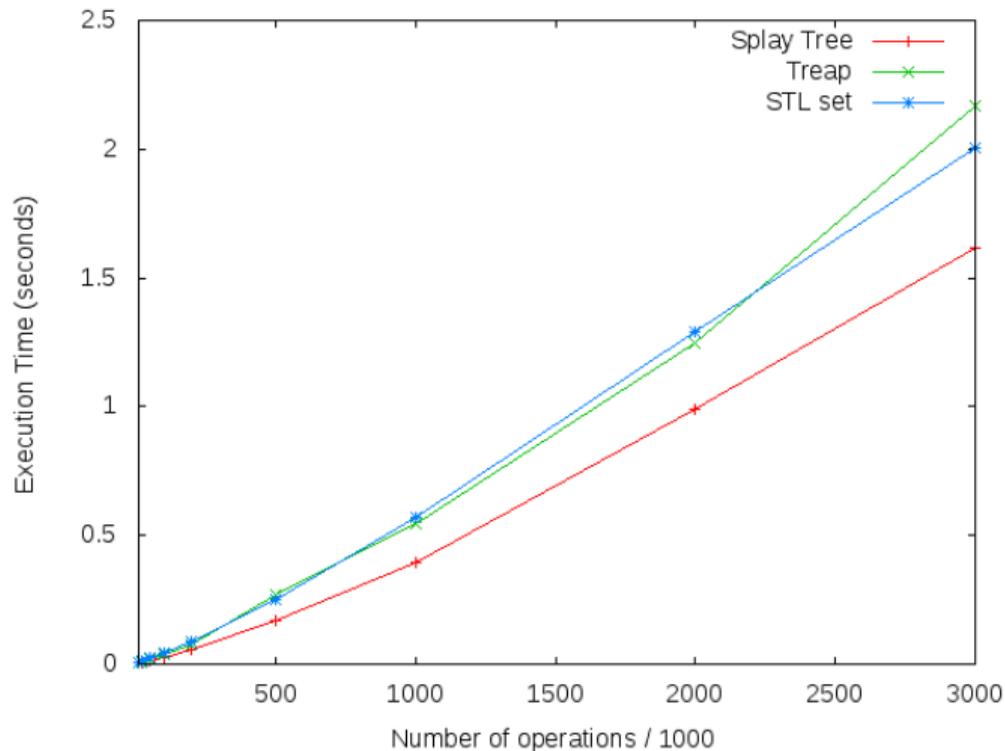
- Java (TreeMap, TreeSet) and C++ (set, map)
- Linux CFS scheduler, which decides which tasks are executed when

- Java (TreeMap, TreeSet) and C++ (set, map)
- Linux CFS scheduler: decides which tasks are executed when
- memory allocators

# Experiment 1: normal queries



## Experiment 2: reduced set of query elements



## Take-home message

- you probably use self-adjusting binary search trees every day :)
- it is useful to know how they work and how to implement one
- C++ STL or java.util cannot save you all the time



## Potential function zig-zag

- only  $x$ ,  $p(x)$  and  $g(x)$  change rank
- $\Delta\Phi = \text{rank}'(g) - \text{rank}(g) + \text{rank}'(x) - \text{rank}(x) + \text{rank}'(p) - \text{rank}(p) =$   
 $\text{rank}'(g) - \text{rank}(x) + \text{rank}'(p) - \text{rank}(p) \leq \text{rank}'(g) + \text{rank}'(p) - 2 * \text{rank}(x)$
- $\text{rank}'(g) + \text{rank}'(p) - 2 * \text{rank}(x) + 2 - 2 \leq [\text{rank}'(g) + \text{rank}'(p) - 2 * \text{rank}(x)] +$   
 $2 * \text{rank}'(x) - \text{rank}(p) - \text{rank}'(g) - 2 \leq 2 * (\text{rank}'(x) - \text{rank}(x)) - 2$