

# Introduction

- Balanced binary search tree (BST)
  - $O(\log n)$  per operation
  - Unbalanced after some insertions and deletions
    - Skinny tree
- Self-organized trees
  - Restructuring the tree according to the operations
  - State-based algorithm and memoryless algorithm

# Introduction (Cont'd)

- Splay trees
  - Invented by Sleator and Tarjan
  - Memoryless algorithm
  - Different from state-based algorithm
    - Dynamic monotone trees, WPL trees and D-trees
    - Store information about the accesses to the nodes

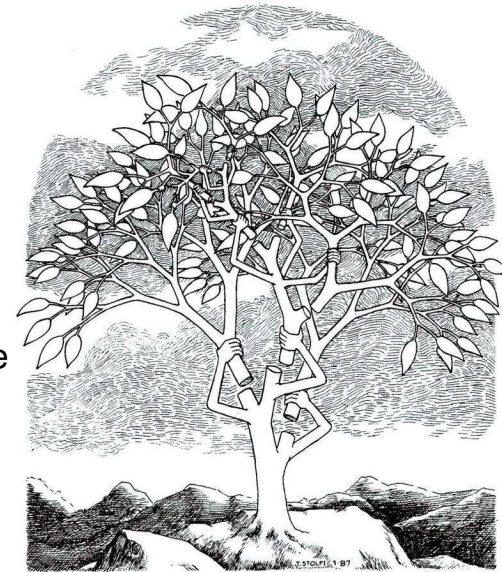
# Splay Tree

by HUNG Lau Yung (Simon)

COMP670K On-line Algorithm, 4<sup>th</sup> November, 2003

# Outline

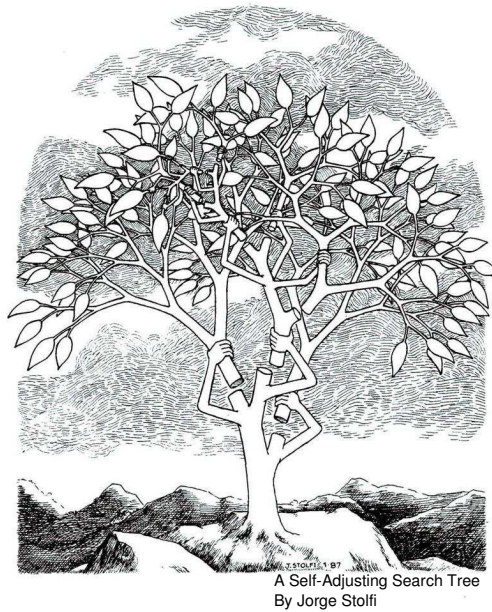
- Introduction
- Splaying
- Cost of splaying
- Splay tree operations
- Application of splay tree
- Conclusion



A Self-Adjusting Search Tree  
By Jorge Stolfi

## Outline

- Introduction
- **Splaying**
- Cost of splaying
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- Conclusion



## Introduction (Cont'd)

- Splay tree
  - Similar to Move-to-Root algorithm [BRAIN ALIEN and IAN MUNRO, 1978]
    - Both of them move the accessed node to the root
  - Different from simple exchange algorithm
    - Rotate the accessed node with its parent

## Splaying

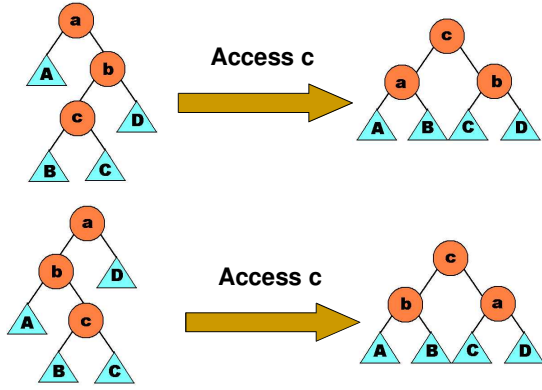
- Splaying rules
  - Each rule consists of a template and a result tree
  - Both template and result are binary trees containing the same number of nodes
  - Each rule is either a terminal rule or non-terminal rule
  - Bottom-up splaying
  - 3 different splaying rules

## Introduction (Cont'd)

- Splay tree
  - All operations are splaying
    - Still keep symmetric order
  - Reduce the height of a BST
  - Good performance for skewed data accesses
  - On-line algorithm
    - Restructuring after each access

# Splaying (Cont'd)

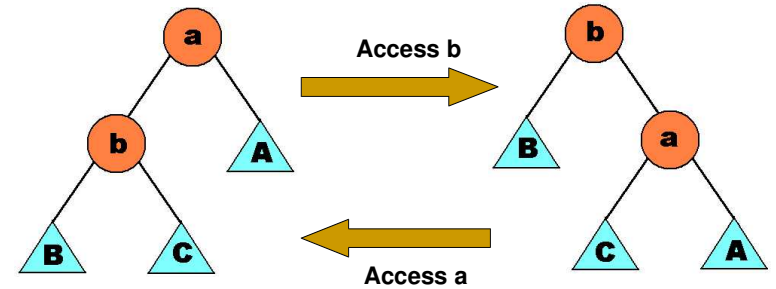
- Rule 3 (ZIG-ZAG rule) – non-terminal rule



# Splaying (Cont'd)

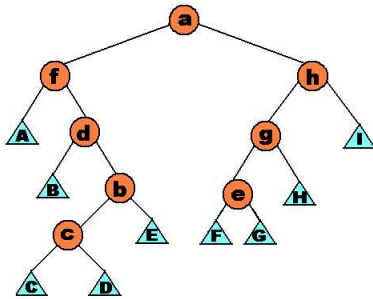
- Rule 1 (ZIG rule) – terminal rule

(This rule is applied at most once depending the access path is odd or even)



# Splaying (Cont'd)

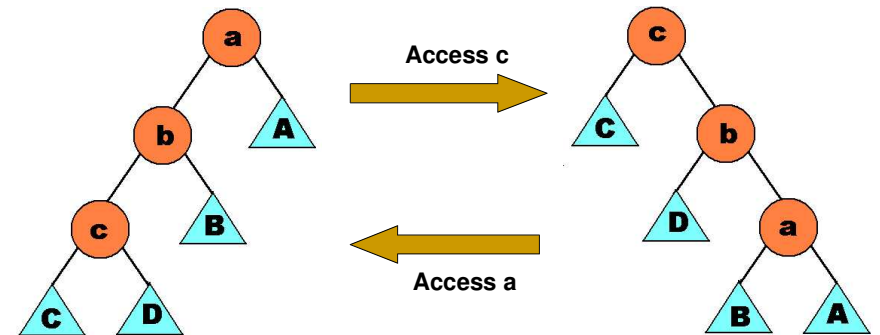
- Example of splaying (access a)



Splay tree demo

# Splaying (Cont'd)

- Rule 2 (ZIG-ZIG rule) – non-terminal rule

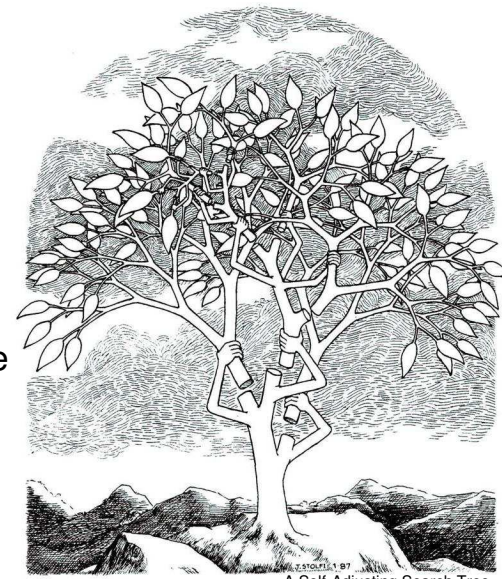


## Cost of Splaying (Cont'd)

- $w(x)$  : weight of a node  $x$  in the tree, a fixed but arbitrary value
- $T$  : denotes the whole splay tree
- $T_x$ : denotes the tree rooted at  $x$
- $y \in T_x$  : means  $y$  is a node in the tree  $T_x$
- $\text{size}(x) = \sum_{y \in T_x} w(y)$
- $\text{Rank}(x) = \log(\text{size}(x))$
- Potential function ( $\Phi$ ) for splay tree =  $\sum_{x \in T} \text{rank}(x)$

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## Cost of Splaying (Cont'd)

- Example of potential of a tree, and all nodes have the same weights which are  $1/6$

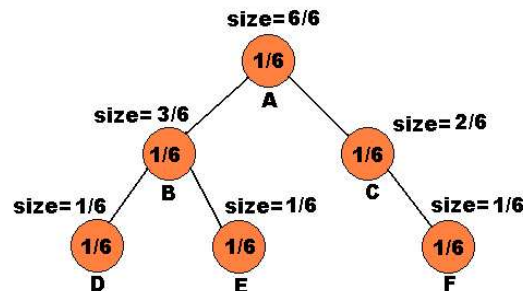
□ e.g. the  $\text{rank}(C) = \log(2/6) = -1.5850$

□ Potential ( $\Phi$ )

$$= 3 \cdot \log(1/6) + \log(2/6)$$

$$+ \log(3/6) + \log(6/6)$$

$$= -10.33985$$

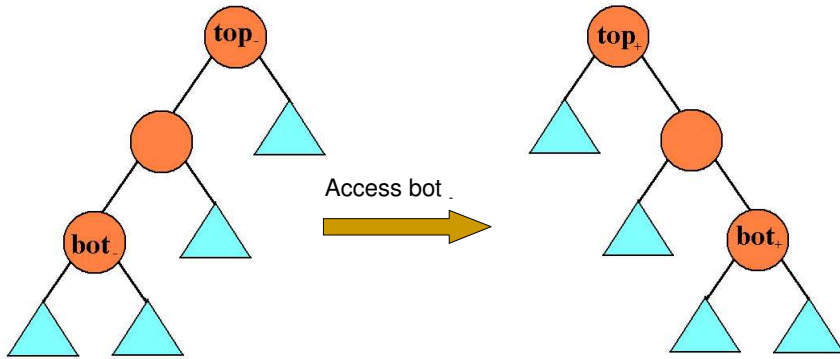


## Cost of Splaying

- Not interested in the cost of each operation
- Interested in the cost of a sequence of accesses, we use **amortized cost**
  - Theoretical cost of a given sequence of operations
  - Consider the change of potential of the tree
- Potential function
  - A measure of a data structure configuration or state

## Cost of Splaying (Cont'd)

- Let  $h$  be the height of the template, e.g.  $h=2$



## Cost of Splaying (Cont'd)

- Amortized cost is defined by **actual operation cost + change of potential**
- Let  $A$  be the amortized cost of applying a splaying rule (here we only consider the non-terminal rules first)

$$A = \Phi_{\text{end}} - \Phi_0 + 1$$

$\Phi_{\text{end}}$ : Potential of the tree after applying the splaying rule  
 $\Phi_0$ : Potential of the tree before applying the splaying rule  
 $1$ : Cost for replacing the template with the result tree

- Let  $\Delta\Phi = \Phi_{\text{end}} - \Phi_0 \Rightarrow A = \Delta\Phi + 1$

## Cost of Splaying (Cont'd)

- $h+1$  nodes in the template, because the template must be a path
- Because  $\text{rank}_+(top_+) = \text{rank}_-(top_-)$ , we only consider  $h$  nodes

$$\Delta\Phi = h(\text{rank}_-(top_-) - \text{rank}_+(bot_+))$$

$\text{Rank}_+(top_+)$  : the maximum rank after applying the rule

$\text{Rank}_-(bot_-)$  : the minimum rank before applying the rule

## Cost of Splaying (Cont'd)

- Only the ranks of the nodes in the template will be changed, implies

$$\Delta\Phi = \sum_{y \in R} \text{rank}_+(y) - \sum_{y \in T} \text{rank}_-(y)$$

$y$  : nodes in the template

$T$  : the template tree

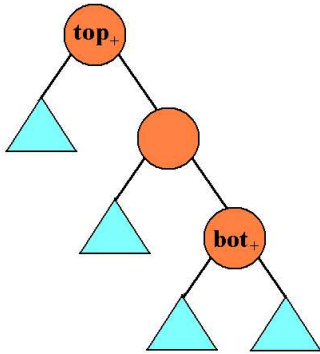
$R$  : the result tree

$\text{rank}_+(y)$ : the rank of node  $y$  after applying the rule

$\text{rank}_-(y)$ : the rank of node  $y$  before applying the rule

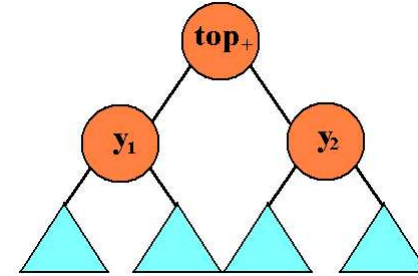
## Cost of Splaying (Cont'd)

- Case 2: the result of the rule is a path



## Cost of Splaying (Cont'd)

- To derive a better upper bound, consider two cases
- Case 1: the result of the rule is not a path



## Cost of Splaying (Cont'd)

- Consider the size of  $top_+$ ,  $bot_+$  and  $bot_-$  (note that  $bot_+$  and  $bot_-$  are disjoint in the result tree)

$$\begin{aligned}
 & size_{\mathcal{L}}(top_+) + size_{\mathcal{L}}(bot_+) + size_{\mathcal{L}}(bot_-) \quad \text{by inequality } (a+b)^2 \leq 4ab \\
 \rightarrow & (size_{\mathcal{L}}(top_+))^2 + 4size_{\mathcal{L}}(bot_+)size_{\mathcal{L}}(bot_-) \\
 \rightarrow & 2rank_{\mathcal{L}}(top_+) + rank_{\mathcal{L}}(bot_+) + rank_{\mathcal{L}}(bot_-) + 2 \quad \text{After taking log}
 \end{aligned}$$

## Cost of Splaying (Cont'd)

- Because  $y_1$  and  $y_2$  are the children of  $top_+$ , implies

$$\begin{aligned}
 & size_{\mathcal{L}}(top_+) + size_{\mathcal{L}}(y_1) + size_{\mathcal{L}}(y_2) \\
 \rightarrow & (size_{\mathcal{L}}(top_+))^2 + (size_{\mathcal{L}}(y_1) + size_{\mathcal{L}}(y_2))^2 \quad \text{by inequality } (a+b)^2 \leq 4ab \\
 \rightarrow & (size_{\mathcal{L}}(top_+))^2 + 4size_{\mathcal{L}}(y_1)size_{\mathcal{L}}(y_2) \\
 \rightarrow & 2rank_{\mathcal{L}}(top_+) + rank_{\mathcal{L}}(y_1) + rank_{\mathcal{L}}(y_2) + 2 \quad \text{After taking log} \\
 \rightarrow & h(rank_{\mathcal{L}}(top_+) - rank_{\mathcal{L}}(bot_-)) + 2 + \clubsuit
 \end{aligned}$$

The last step is because the result tree contains  $y_1$  and  $y_2$ , therefore they are overestimate by the  $rank_+(top_+)$

## Cost of Splaying (Cont'd)

$$-(h+1)(\text{rank}_+(top_+) - \text{rank}_-(bot_-)) \geq \Delta\Phi$$

- The above inequality is only for applying one splaying rule
- If we repeat to apply the splaying rule until the accessed node becomes the root
- Then we just sum up the above equation for applying different splaying rules to find the upper bound for amortized cost per access
- All terms in the intermediate trees will be cancelled out

## Cost of Splaying (Cont'd)

- In  $-(h+1)(\text{rank}_+(top_+) - \text{rank}_-(bot_-)) \geq \Delta\Phi$ , it overestimates  $\text{rank}_+(bot_-)$  by  $\text{rank}_+(top_+)$ , if we add  $\text{rank}_+(top_+) - \text{rank}_-(bot_-)$  to the right hand side and combine with  $2\text{rank}_+(top_+) - \text{rank}_-(bot_-) - \text{rank}_-(bot_-) = 2$

$$-(h+1)(\text{rank}_+(top_+) - \text{rank}_-(bot_-)) - 2 \geq \Delta\Phi$$

We get

## Cost of Splaying (Cont'd)

- So we only concern the change of potential for the initial tree and the result tree
- Now let  $A_{\text{access\_node}}$  be the amortized cost for splaying a node  $i$  to the root

Because the height of the splaying template is at most 2

Rank of the initial access node

If the access path is odd, then rule 1 need to be applied

$$A_{\text{access\_node}} \leq 3(\text{rank}(r) - \text{rank}(i)) + 1$$

Rank of the root

$$\uparrow 3 \log(\text{size}(r)/\text{size}(i))$$

$$\uparrow O(\log(\text{size}(r)/\text{size}(i)))$$

## Cost of Splaying (Cont'd)

- Combine case 1 and case 2, we have

$$-(h+1)(\text{rank}_+(top_+) - \text{rank}_-(bot_-)) \geq \Delta\Phi + 2$$

- Since amortized cost (A) after applying one splaying rule =  $\Delta\Phi + 1$ , implies

$$-(h+1)(\text{rank}_+(top_+) - \text{rank}_-(bot_-)) \geq \Delta\Phi$$

[ASHOK SUBRAMANIAN, 1996]

## Cost of Splaying (Cont'd)

- The largest potential drop ( $\Phi_0 - \Phi_m$ ) is  $\sum_{i=1}^n \log(W/w(i))$  where  $w(i)$  is the weight of node  $i$  and  $w = \sum_{i=1}^n w(i)$
- So we have

$$t_{\text{total}} \leq \sum_{j=1}^m (3\log(\text{size}(r)/w(i_j)) + 1) + \sum_{i=1}^n \log(W/w(i))$$

size(r)=W  
because r is  
the root

$$= \sum_{j=1}^m (3\log(W/w(i_j)) + 1) + \sum_{i=1}^n \log(W/w(i))$$

## Cost of Splaying (Cont'd)

- The total operation cost ( $t_{\text{total}}$ ) over  $m$  accesses
- Recall that  
amortized cost = actual operation cost + change of potential

so we have

$$A_j = t_j + \Phi_j - \Phi_{j-1}$$

$A_j$ : the amortized cost for the  $j$ th access

$t_j$ : the actual operation cost for the  $j$ th access

$\Phi_{j-1}$ : the potential before the  $j$ th access

$\Phi_j$ : the potential after the  $j$ th access

## Cost of Splaying (Cont'd)

- Balance Theorem:** [SLEATOR and TARJAN, 1985]  
the total access cost ( $t_{\text{total}}$ ) is

$$O((m+n) \log(n) + m)$$

$n$ : the number of nodes in the tree

$m$ : the number of accesses

## Cost of Splaying (Cont'd)

- So total operation cost ( $t_{\text{total}}$ ) over  $m$  operations is:

$$t_{\text{total}} = \sum_{j=1}^m t_j = \sum_{j=1}^m (A_j + \Phi_{j-1} - \Phi_j)$$

$$\Rightarrow t_{\text{total}} = \sum_{j=1}^m A_j + \Phi_0 - \Phi_m$$

$$\Rightarrow t_{\text{total}} \leq \sum_{j=1}^m (3\log(\text{size}(r)/\text{size}(i_j)) + 1) + \Phi_0 - \Phi_m$$

The initial size of the  
 $j$ th accessed node

$$\Rightarrow t_{\text{total}} \leq \sum_{j=1}^m (3\log(\text{size}(r)/w(i_j)) + 1) + \Phi_0 - \Phi_m$$

Because size( $i_j$ )  
is at least  $w(i_j)$



## Cost of Splaying (Cont'd)

### Proof of Static Optimality Theorem:

Assign a weight of  $q(i)/m$  to node  $i$ , then

$$\begin{aligned}
 t_{\text{total}} &\leq \sum_{j=1}^m (3\log(W/w(i_j)) + 1) + \sum_{i=1}^n \log(W/w(i)) \\
 &= \sum_{j=1}^m (3\log(1/(q(i_j)/m)) + 1) + \sum_{i=1}^n \log(1/(q(i)/m)) \\
 &= \sum_{j=1}^m (3\log(m/q(i_j))) + m + \sum_{i=1}^n \log(m/q(i)) \\
 &= \sum_{i=1}^n q(i)(3\log(m/q(i))) + m + \sum_{i=1}^n \log(m/q(i)) \\
 &= O\left(\sum_{i=1}^n q(i)(\log(m/q(i))) + m\right)
 \end{aligned}$$

$W=1, w(i)=q(i)/m$   
 Because each node is accessed at least once, so the last term can be dropped

## Cost of Splaying (Cont'd)

### Proof of balance theorem:

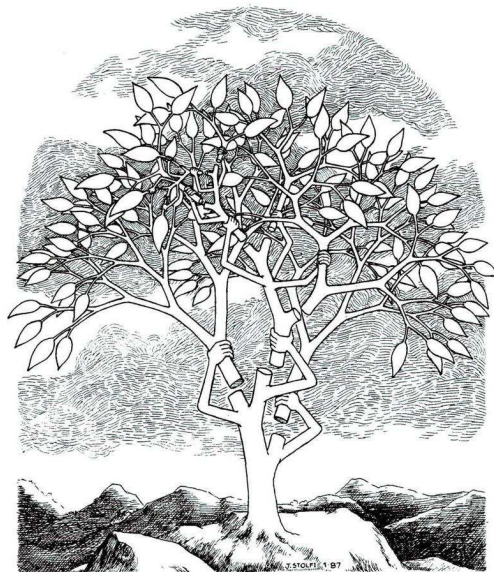
Assign a weight of  $1/n$  to each node in the tree, then

$$\begin{aligned}
 t_{\text{total}} &\leq \sum_{j=1}^m (3\log(W/w(i_j)) + 1) + \sum_{i=1}^n \log(W/w(i)) \\
 &= \sum_{j=1}^m (3\log(1/(1/n)) + 1) + \sum_{i=1}^n \log(1/(1/n)) \\
 &= m * 3\log(n) + m + n * \log(n) \\
 &= O((m + n)\log(n) + m)
 \end{aligned}$$

Because  $w(i)=w(i)=1/n$ , and  $W=1$

## Outline

- Introduction
- Splaying
- Cost of splaying
- **Splay tree operations**
- Application of splay tree
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## Cost of Splaying (Cont'd)

### ■ Static Optimality Theorem:

[SLEATOR and TARJAN, 1985]

If every item is accessed at least once, then the total access cost ( $t_{\text{total}}$ ) is

$$O\left(\sum_{i=1}^n q(i) \log(m/q(i)) + m\right)$$

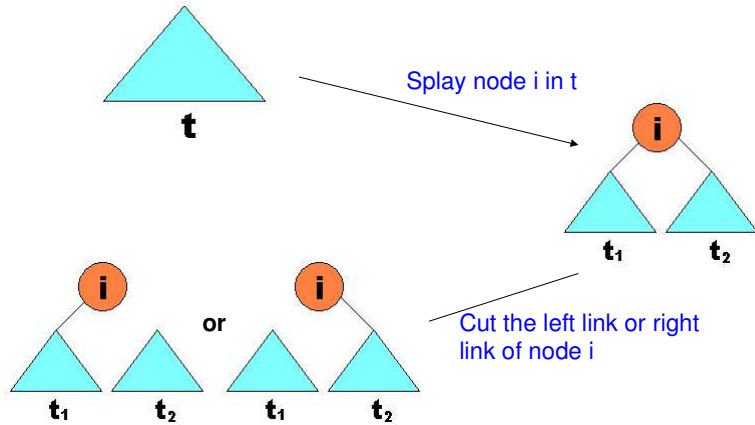
$n$ : the number of nodes in the tree

$m$ : the number of accesses

$q(i)$ : the number of accesses to node  $i$ , and  $\sum_{i=1}^n q(i) = m$

# Splay Tree Operations

- Split(i,t): split the tree t at the node i



# Splay Tree Operations

- In this section, we use  $W_t$  to represent the total weights of a tree t.
- Access(i,t): access the node i in the tree t

- If node i is in the tree t,
  - First go down the tree, and locate the node
  - Splay the node i to the root
  - Amortized cost (A):  $A = 3 \log \left( \frac{\text{size}(r)}{\text{size}(i)} \right) + 1$
- If node i not in the tree t,
  - First go down the tree, and locate a node i- or i+, where i- is the node preceding node i, i+ is the node following i
  - Splay i- or i+ to the root
  - Amortized cost (A):

$$\leq 3 \log \left( \frac{W_t}{w(i)} \right) + 1$$

$$A \leq 3 \log \left( \frac{W_t}{\min \{w(i-), w(i+)\}} \right) + 1$$

# Splay Tree Operations

- Amortized Cost (A) of split operation:

- If i is in the tree t, then

$$A \leq 3 \log \left( \frac{W_t}{w(i)} \right) + O(1)$$

Cost for splaying node i to the root of t

Cost for cut the left or right link of node i

- If i is not in the tree t, then

(Recall that i- is the node preceding i, i+ is the node following i)

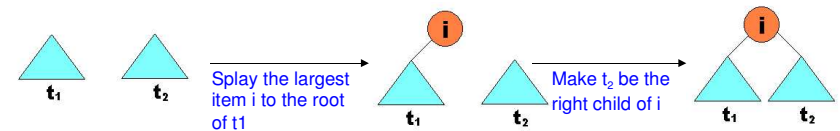
$$A \leq 3 \log \left( \frac{W_t}{\min \{w(i-), w(i+)\}} \right) + O(1)$$

Cost for splaying node i- or i+ to the root of t

Cost for cut the left or right link of node i- or i+

# Splay Tree Operations

- Join(t1,t2): join a tree t1 with another tree t2, all the elements in t2 are greater than t1



$$A \leq 3 \log \left( \frac{W_{t1}}{w(i)} \right) + O(1)$$

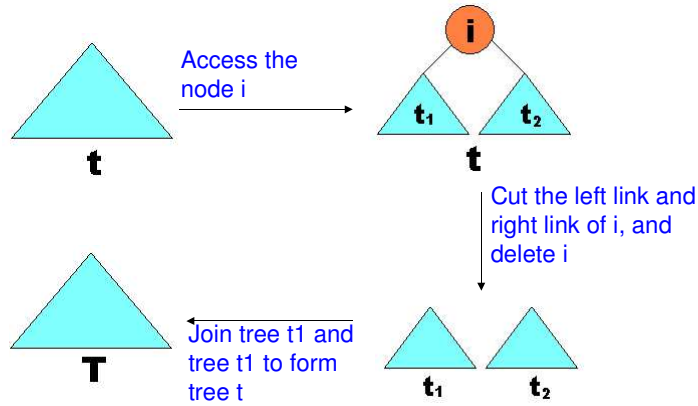
- Amortized Cost of join operation:

Cost for splaying the node i in t1

Cost for making t2 be the right child of i

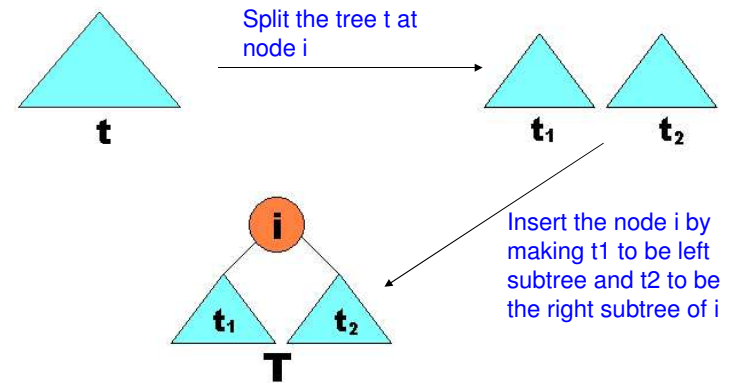
# Splay Tree Operations

- Delete(i,t): delete node i from the tree t



# Splay Tree Operations

- Insert(i,t): insert a node i into the tree t



# Splay Tree Operations

- Amortized cost (A) of delete operation:

$$A \leq 3 \log \left( \frac{W_t}{w(i)} \right) + 3 \log \left( \frac{W_t - w(i)}{w(i^-)} \right) + O(1)$$

Cost for access node i in tree t

Cost for join the two subtree t<sub>1</sub> and t<sub>2</sub>

Cost for cut the links in the intermediate tree

[SLEATOR and TARJAN, 1985]

# Splay Tree Operations

- Amortized Cost (A) of insert operation:

$$A \leq 3 \log \left( \frac{(W_T - w(i))}{\min\{w(i^-), w(i^+)\}} \right) + \log \left( \frac{W_T}{w(i)} \right) + O(1)$$

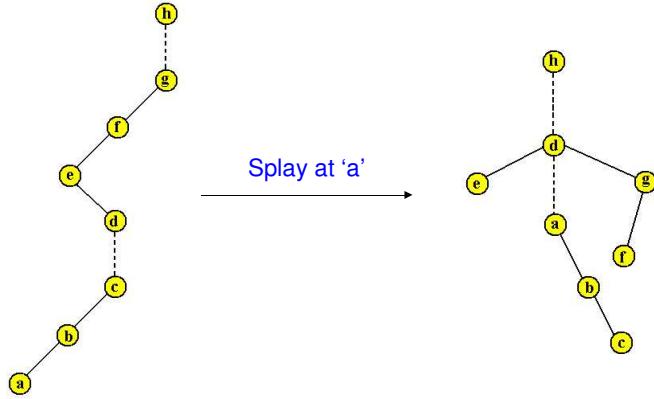
The cost for splitting the tree t, because tree t does not contain i, so the total weight of t = (W<sub>T</sub> - w(i))

The change in potential for the tree before the insert of i (but after the split step) and the after the insert of i

Some constant cost for linking the two trees in the final step

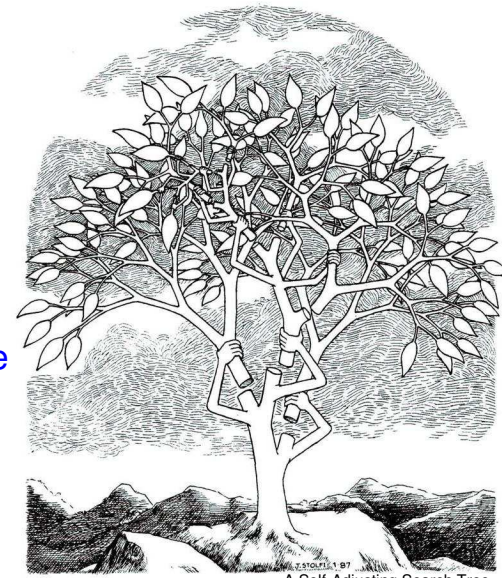
# Application of Splay Tree

- Example of splaying in a lexicographic splay tree



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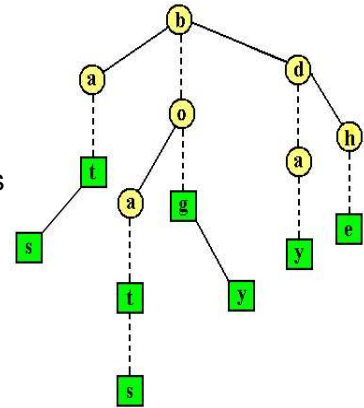
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# Application of Splay Tree

- When a string is accessed, we just splay the string character by character
- Most frequent accessed string will be near the root
- The tree store the prefix for the string, so this reduce the redundancy

# Application of Splay Tree

- Lexicographic search tree
  - Circle and square are nodes, square is terminal node of a string
  - The solid lines form the binary trees and they represent different strings
  - The dashed lines represent a continuous string
  - The graph consists the words: "at", "as", "bat", "bats", "bog", "boy", "day", "he"



## Conclusion

- Splaying
  - 3 different rules
  - Reduce the tree height
  - Move the frequently accessed node near the root
- The amortized and actual cost of splaying
  - Use of potential function
  - Balance and static optimality theorem

## Application of Splay Tree

- Other application – data compression
  - Dynamic Huffman coding [D.W. JONES, 1988]
    - Digital search tree
    - Good compression scheme for image data

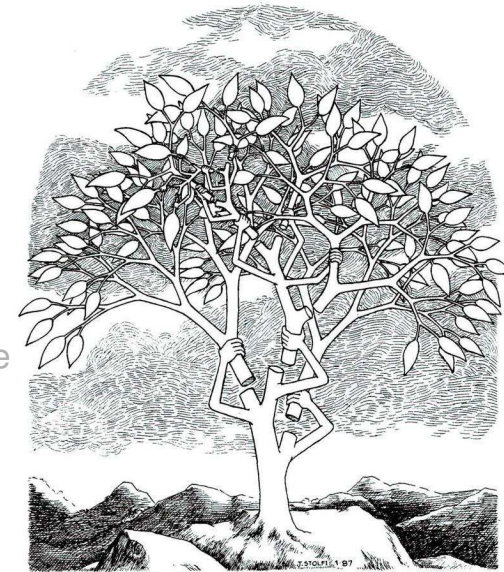
## Conclusion

- Splay tree operation
  - Access
  - Join
  - Split
  - Insert
  - Delete
- Application of splay tree
  - Lexicographic splay tree

- End -

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