

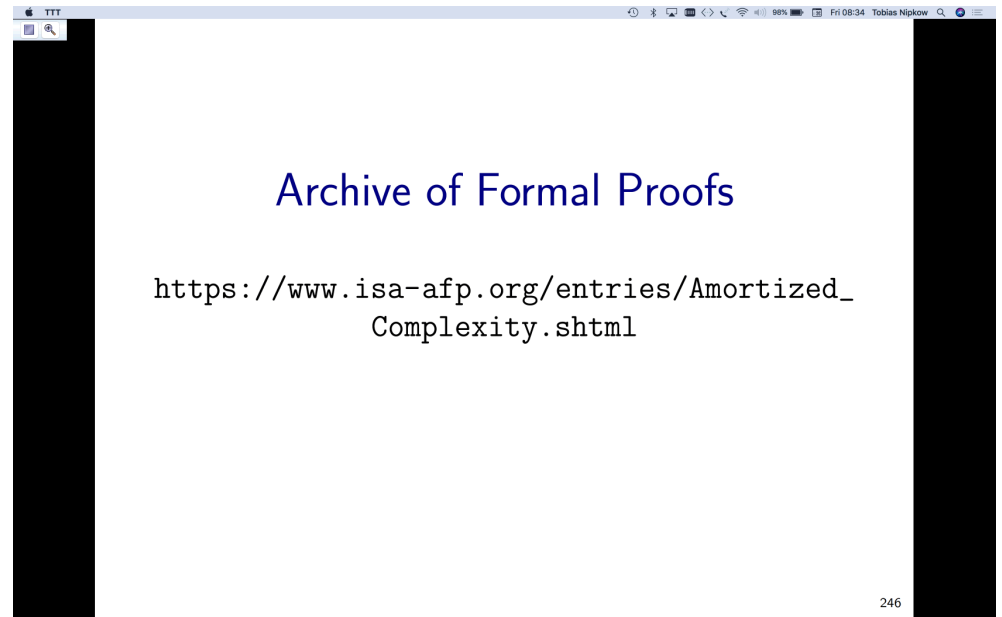
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Archive of Formal Proofs

https://www.isa-afp.org/entries/Amortized_Complexity.shtml

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Archive of Formal Proofs



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A *skew heap* is a self-adjusting heap (priority queue)

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Functions *insert*, *merge* and *del_min*
have amortized logarithmic complexity.

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Functions *insert*, *merge* and *del_min*
have amortized logarithmic complexity.

Functions *insert* and *del_min* are defined via *merge*

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Implementation type

Ordinary binary trees

Invariant: *heap*

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merge

$\text{merge } \langle \rangle h = h$
 $\text{merge } h \langle \rangle = h$

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merge

$\text{merge } \langle \rangle h = h$
 $\text{merge } h \langle \rangle = h$

Swap subtrees when descending:

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merge

$\text{merge } \langle \rangle h = h$
 $\text{merge } h \langle \rangle = h$

Swap subtrees when descending:

$\text{merge } (\langle l_1, a_1, r_1 \rangle =: h_1) (\langle l_2, a_2, r_2 \rangle =: h_2) =$
(if $a_1 \leq a_2$ then $\langle \text{merge } h_2 \ r_1, a_1, l_1 \rangle$
else $\langle \text{merge } h_1 \ r_2, a_2, l_2 \rangle$)

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merge

Very similar to leftist heap but

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Logarithmic amortized complexity

Theorem

$$t_merge\ t_1\ t_2 + \Phi(\text{merge}\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2 \\ \leq 3 * \log_2(|t_1|_1 + |t_2|_1) + 1$$

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Towards the proof

Right heavy:

$$rh\ l\ r = (\text{if } |l| < |r| \text{ then } 1 \text{ else } 0)$$

255

Towards the proof

Right heavy:

$$rh\ l\ r = (\text{if } |l| < |r| \text{ then } 1 \text{ else } 0)$$

Number of right heavy nodes on left spine:

$$lrh\ \langle \rangle = 0$$

$$lrh\ \langle l, -, r \rangle = rh\ l\ r + lrh\ l$$

255

Towards the proof

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$$rh\ l\ r = (\text{if } |l| < |r| \text{ then } 1 \text{ else } 0)$$

Number of right heavy nodes on left spine:

$$lrh\ \langle \rangle = 0$$

$$lrh\ \langle l, -, r \rangle = rh\ l\ r + lrh\ l$$

Lemma

$$2^{lrh\ h} \leq |h| + 1$$

255

Towards the proof

Right heavy:

$$rh\ l\ r = (\text{if } |l| < |r| \text{ then } 1 \text{ else } 0)$$

Number of right heavy nodes on left spine:

$$lrh\ \langle \rangle = 0$$

$$lrh\ \langle l, -, r \rangle = rh\ l\ r + lrh\ l$$

Lemma

$$2^{lrh\ h} \leq |h| + 1$$

Corollary

$$lrh\ h \leq \log_2 |h|_1$$

255

Towards the proof

Right heavy:

$$rh\ l\ r = (\text{if } |l| < |r| \text{ then } 1 \text{ else } 0)$$

Number of not right heavy nodes on right spine:

$$rlh\ \langle \rangle = 0$$

$$rlh\ \langle l, -, r \rangle = 1 - rh\ l\ r + rlh\ r$$

Lemma

$$2^{rlh\ h} \leq |h| + 1$$

Corollary

$$rlh\ h \leq \log_2 |h|_1$$

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Potential

The potential is the number of right heavy nodes:

$$\Phi\ \langle \rangle = 0$$

$$\Phi\ \langle l, -, r \rangle = \Phi\ l + \Phi\ r + rh\ l\ r$$

merge descends on the right

\implies right heavy nodes are bad

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Potential

The potential is the number of right heavy nodes:

$$\Phi\ \langle \rangle = 0$$

$$\Phi\ \langle l, -, r \rangle = \Phi\ l + \Phi\ r + rh\ l\ r$$

merge descends on the right

\implies right heavy nodes are bad

Lemma

$$t.merge\ t_1\ t_2 + \Phi\ (merge\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2 \\ \leq lrh\ (merge\ t_1\ t_2) + rlh\ t_1 + rlh\ t_2 + 1$$

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Potential

The potential is the number of right heavy nodes:

$$\Phi \langle \rangle = 0$$

$$\Phi \langle l, -, r \rangle = \Phi l + \Phi r + rh\ l\ r$$

merge descends on the right

\implies right heavy nodes are bad

Lemma

$$t_merge\ t_1\ t_2 + \Phi (merge\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2$$

$$\leq lrh (merge\ t_1\ t_2) + rlh\ t_1 + rlh\ t_2 + 1$$

by(induction t1 t2 rule: merge.induct)(auto)

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Node-Node case

Let $t_1 = \langle l_1, a_1, r_1 \rangle$, $t_2 = \langle l_2, a_2, r_2 \rangle$.

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Node-Node case

Let $t_1 = \langle l_1, a_1, r_1 \rangle$, $t_2 = \langle l_2, a_2, r_2 \rangle$.

Case $a_1 \leq a_2$. Let $m = merge\ t_2\ r_1$

$$t_merge\ t_1\ t_2 + \Phi (merge\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2$$

$$= t_merge\ t_2\ r_1 + 1 + \Phi\ m + \Phi\ l_1 + rh\ m\ l_1$$

$$- \Phi\ t_1 - \Phi\ t_2$$

$$= t_merge\ t_2\ r_1 + 1 + \Phi\ m + rh\ m\ l_1$$

$$- \Phi\ r_1 - rh\ l_1\ r_1 - \Phi\ t_2$$

$$\leq lrh\ m + rlh\ t_2 + rlh\ r_1 + rh\ m\ l_1 + 2 - rh\ l_1\ r_1$$

by IH

$$= lrh\ m + rlh\ t_2 + rlh\ t_1 + rh\ m\ l_1 + 1$$

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Node-Node case

Let $t_1 = \langle l_1, a_1, r_1 \rangle$, $t_2 = \langle l_2, a_2, r_2 \rangle$.

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Main proof

$$\begin{aligned} & t_merge\ t_1\ t_2 + \Phi\ (merge\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2 \\ & \leq lrh\ (merge\ t_1\ t_2) + rlh\ t_1 + rlh\ t_2 + 1 \\ & \leq \log_2\ |merge\ t_1\ t_2|_1 + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & = \log_2\ (|t_1|_1 + |t_2|_1 - 1) + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \end{aligned}$$

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Main proof

$$\begin{aligned} & t_merge\ t_1\ t_2 + \Phi\ (merge\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2 \\ & \leq lrh\ (merge\ t_1\ t_2) + rlh\ t_1 + rlh\ t_2 + 1 \\ & \leq \log_2\ |merge\ t_1\ t_2|_1 + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & = \log_2\ (|t_1|_1 + |t_2|_1 - 1) + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & \leq \log_2\ (|t_1|_1 + |t_2|_1) + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & \leq \log_2\ (|t_1|_1 + |t_2|_1) + 2 * \log_2\ (|t_1|_1 + |t_2|_1) + 1 \\ & \quad \text{because } \log_2\ x + \log_2\ y \leq 2 * \log_2\ (x + y) \text{ if } x, y > 0 \end{aligned}$$

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Main proof

$$\begin{aligned} & t_merge\ t_1\ t_2 + \Phi\ (merge\ t_1\ t_2) - \Phi\ t_1 - \Phi\ t_2 \\ & \leq lrh\ (merge\ t_1\ t_2) + rlh\ t_1 + rlh\ t_2 + 1 \\ & \leq \log_2\ |merge\ t_1\ t_2|_1 + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & = \log_2\ (|t_1|_1 + |t_2|_1 - 1) + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & \leq \log_2\ (|t_1|_1 + |t_2|_1) + \log_2\ |t_1|_1 + \log_2\ |t_2|_1 + 1 \\ & \leq \log_2\ (|t_1|_1 + |t_2|_1) + 2 * \log_2\ (|t_1|_1 + |t_2|_1) + 1 \\ & \quad \text{because } \log_2\ x + \log_2\ y \leq 2 * \log_2\ (x + y) \text{ if } x, y > 0 \\ & = 3 * \log_2\ (|t_1|_1 + |t_2|_1) + 1 \end{aligned}$$

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insert and del_min

Easy consequences:

Lemma

$$\begin{aligned} & t_insert\ a\ h + \Phi\ (insert\ a\ h) - \Phi\ h \\ & \leq 3 * \log_2\ (|h|_1 + 2) + 2 \end{aligned}$$

Lemma

$$\begin{aligned} & t_del_min\ h + \Phi\ (del_min\ h) - \Phi\ h \\ & \leq 3 * \log_2\ (|h|_1 + 2) + 2 \end{aligned}$$

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Sources

The inventors of skew heaps:
Daniel Sleator and Robert Tarjan.
Self-adjusting Heaps.
SIAM J. Computing, 1986.

261

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The formalization is based on
Anne Kaldewaij and Berry Schoenmakers.
The Derivation of a Tighter Bound for Top-down Skew
Heaps. *Information Processing Letters*, 1991.

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- 20 Amortized Complexity
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- 22 Splay Tree
- 23 Pairing Heap
- 24 More Verified Data Structures and Algorithms
(in Isabelle/HOL)

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A *splay tree* is a self-adjusting binary search tree.

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Definition (splay)

Become wider or more separated.

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Definition (splay)

Become wider or more separated.

Example

The river splayed out into a delta.

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Splay tree

Implementation type = binary tree

Key operation *splay a*:

- 1 Search for a ending up at x where $x = a$ or x is a leaf node.

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Splay tree

Implementation type = binary tree

Key operation *splay a*:

- 1 Search for a ending up at x where $x = a$ or x is a leaf node.
- 2 Move x to the root of the tree by rotations.

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Splay tree

Implementation type = binary tree

Key operation *splay a*:

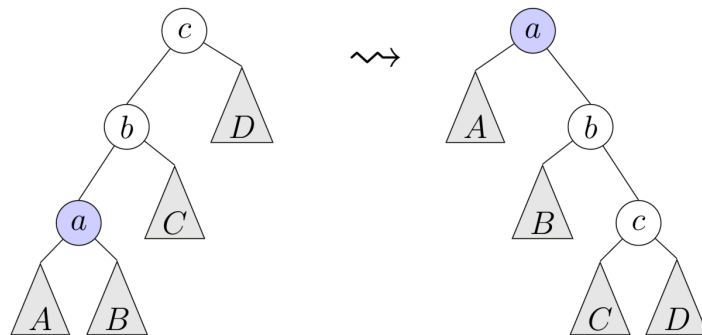
- 1 Search for a ending up at x where $x = a$ or x is a leaf node.
- 2 Move x to the root of the tree by rotations.

Derived operations *isin/insert/delete a*:

- 1 *splay a*
- 2 Perform *isin/insert/delete* action

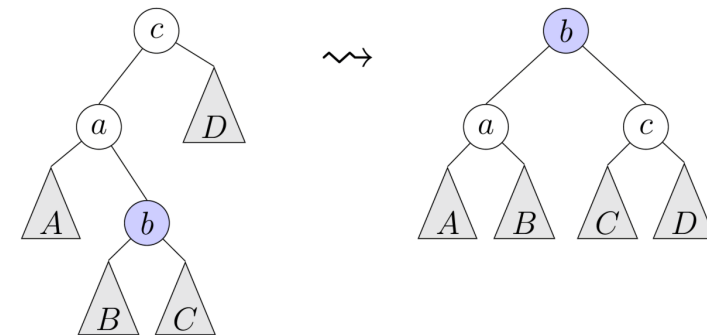
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Zig-zig



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Zig-zag



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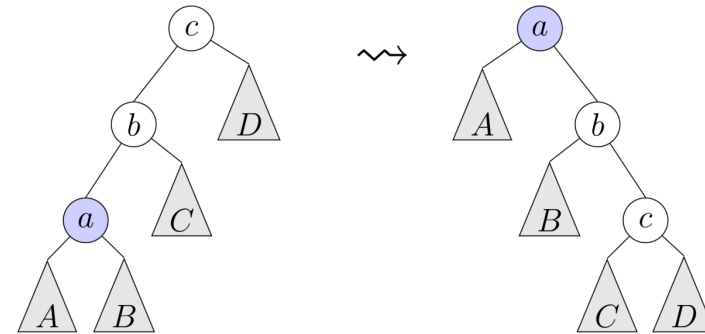
Zig-zig and zig-zag

Zig-zig \neq two single rotations

Zig-zag = two single rotations

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Zig-zig



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Functional definition

$splay :: 'a \Rightarrow 'a \text{ tree} \Rightarrow 'a \text{ tree}$

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Zig-zig and zig-zag

$\llbracket x < b; x < c; AB \neq \langle \rangle \rrbracket$
 $\Rightarrow splay\ x\ \langle \langle AB, b, C \rangle, c, D \rangle =$
 (case $splay\ x\ AB$ of
 $\langle A, a, B \rangle \Rightarrow \langle A, a, \langle B, b, \langle C, c, D \rangle \rangle$)

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Zig-zig and zig-zag

$\llbracket x < b; x < c; AB \neq \langle \rangle \rrbracket$
 $\implies \text{splay } x \langle \langle AB, b, C \rangle, c, D \rangle =$
 (case splay x AB of
 $\langle A, a, B \rangle \Rightarrow \langle A, a, \langle B, b, \langle C, c, D \rangle \rangle \rangle$)

$\llbracket x < c; c < a; BC \neq \langle \rangle \rrbracket$
 $\implies \text{splay } c \langle \langle A, x, BC \rangle, a, D \rangle =$
 (case splay c BC of
 $\langle B, b, C \rangle \Rightarrow \langle \langle A, x, B \rangle, b, \langle C, a, D \rangle \rangle$)

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Some base cases

$x < b \implies \text{splay } x \langle \langle A, x, B \rangle, b, C \rangle =$

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Some base cases

$x < b \implies \text{splay } x \langle \langle A, x, B \rangle, b, C \rangle = \langle A, x, \langle B, b, C \rangle \rangle$

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Some base cases

$x < b \implies \text{splay } x \langle \langle A, x, B \rangle, b, C \rangle = \langle A, x, \langle B, b, C \rangle \rangle$

$x < a \implies$
 $\text{splay } x \langle \langle \langle \rangle, a, A \rangle, b, B \rangle =$

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Functional correctness proofs

Automatic

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Potential

Sum of logarithms of the size of all nodes:

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Potential

Sum of logarithms of the size of all nodes:

$$\Phi \langle \rangle = 0$$

$$\Phi \langle l, a, r \rangle = \Phi l + \Phi r + \varphi \langle l, a, r \rangle$$

$$\text{where } \varphi t = \log_2 (|t| + 1)$$

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Potential

Sum of logarithms of the size of all nodes:

$$\Phi \langle \rangle = 0$$

$$\Phi \langle l, a, r \rangle = \Phi l + \Phi r + \varphi \langle l, a, r \rangle$$

$$\text{where } \varphi t = \log_2 (|t| + 1)$$

Amortized complexity of *splay*:

$$a_splay\ a\ t = t_splay\ a\ t + \Phi (splay\ a\ t) - \Phi t$$

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Analysis of *splay*

Theorem

$\llbracket \text{bst } t; \langle l, a, r \rangle \in \text{subtrees } t \rrbracket$

$$\implies a_splay\ a\ t \leq 3 * (\varphi\ t - \varphi\ \langle l, a, r \rangle) + 1$$

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Analysis of *splay*

Theorem

$\llbracket \text{bst } t; \langle l, a, r \rangle \in \text{subtrees } t \rrbracket$

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Corollary

$\llbracket \text{bst } t; a \in \text{set_tree } t \rrbracket$

$$\implies a_splay\ a\ t \leq 3 * (\varphi\ t - 1) + 1$$

279

Analysis of *splay*

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$\llbracket bst\ t; a \in set_tree\ t \rrbracket$
 $\implies a_splay\ a\ t \leq 3 * (\varphi\ t - 1) + 1$

Corollary

$bst\ t \implies a_splay\ a\ t \leq 3 * \varphi\ t + 1$

Lemma

$\llbracket t \neq \langle \rangle; bst\ t \rrbracket$
 $\implies \exists a' \in set_tree\ t.$
 $splay\ a'\ t = splay\ a\ t \wedge t_splay\ a'\ t = t_splay\ a\ t$

Analysis of *splay*

Theorem

$\llbracket bst\ t; \langle l, a, r \rangle \in subtrees\ t \rrbracket$
 $\implies a_splay\ a\ t \leq 3 * (\varphi\ t - \varphi\ \langle l, a, r \rangle) + 1$

Corollary

$\llbracket bst\ t; a \in set_tree\ t \rrbracket$
 $\implies a_splay\ a\ t \leq 3 * (\varphi\ t - 1) + 1$

Corollary

$bst\ t \implies a_splay\ a\ t \leq 3 * \varphi\ t + 1$

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Analysis of *splay*

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$\llbracket bst\ t; \langle l, a, r \rangle \in subtrees\ t \rrbracket$
 $\implies a_splay\ a\ t \leq 3 * (\varphi\ t - \varphi\ \langle l, a, r \rangle) + 1$

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$\llbracket bst\ t; a \in set_tree\ t \rrbracket$
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$bst\ t \implies a_splay\ a\ t \leq 3 * \varphi\ t + 1$

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 $splay\ a'\ t = splay\ a\ t \wedge t_splay\ a'\ t = t_splay\ a\ t$

insert

Definition

$insert\ x\ t =$

(if $t = \langle \rangle$ then $\langle \langle \rangle, x, \langle \rangle$)

else case *splay* $x\ t$ of

$\langle l, a, r \rangle \Rightarrow$ case *cmp* $x\ a$ of

$LT \Rightarrow \langle l, x, \langle \langle \rangle, a, r \rangle \rangle$

$EQ \Rightarrow \langle l, a, r \rangle$

$GT \Rightarrow \langle \langle l, a, \langle \rangle \rangle, x, r \rangle$)

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insert

Definition

$insert\ x\ t =$

(if $t = \langle \rangle$ then $\langle \langle \rangle, x, \langle \rangle$)

else case *splay* $x\ t$ of

$\langle l, a, r \rangle \Rightarrow$ case *cmp* $x\ a$ of

$LT \Rightarrow \langle l, x, \langle \langle \rangle, a, r \rangle \rangle$

$EQ \Rightarrow \langle l, a, r \rangle$

$GT \Rightarrow \langle \langle l, a, \langle \rangle \rangle, x, r \rangle$)

Counting only the cost of *splay*:

Lemma

$bst\ t \Rightarrow$

$t_splay\ a\ t + \Phi\ (insert\ a\ t) - \Phi\ t \leq 4 * \varphi\ t + 2$

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delete

Definition

$delete\ x\ t =$

(if $t = \langle \rangle$ then $\langle \rangle$)

else case *splay* $x\ t$ of

$\langle l, a, r \rangle \Rightarrow$

 if $x = a$

 then if $l = \langle \rangle$ then r

 else case *splay_max* l of

$\langle l', m, r' \rangle \Rightarrow \langle l', m, r \rangle$

 else $\langle l, a, r \rangle$)

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delete

Definition

$delete\ x\ t =$

(if $t = \langle \rangle$ then $\langle \rangle$)

else case *splay* $x\ t$ of

$\langle l, a, r \rangle \Rightarrow$

 if $x = a$

 then if $l = \langle \rangle$ then r

 else case *splay_max* l of

$\langle l', m, r' \rangle \Rightarrow \langle l', m, r \rangle$

 else $\langle l, a, r \rangle$)

Lemma

$bst\ t \Rightarrow$

$t_delete\ a\ t + \Phi\ (delete\ a\ t) - \Phi\ t \leq 6 * \varphi\ t + 2$

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Remember

Amortized analysis is only correct for **single threaded** uses of a data structure.

Otherwise:

```
let counter = 0;  
bad = increment counter  $2^n - 1$  times;  
_ = incr bad;  
_ = incr bad;  
_ = incr bad;  
⋮
```

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isin :: 'a tree ⇒ 'a ⇒ bool

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isin :: 'a tree ⇒ 'a ⇒ bool

Single threaded ⇒ *isin* *t a* eats up *t*

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isin :: 'a tree ⇒ 'a ⇒ bool

Single threaded ⇒ *isin* *t a* eats up *t*

Otherwise:

```
let bad = build unbalanced splay tree;  
_ = isin bad a;  
_ = isin bad a;  
_ = isin bad a;  
⋮
```

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Solution 1:

$$isin :: 'a \text{ tree} \Rightarrow 'a \Rightarrow \text{bool} \times 'a \text{ tree}$$

Observer function returns new data structure:

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Solution 1:

$$isin :: 'a \text{ tree} \Rightarrow 'a \Rightarrow \text{bool} \times 'a \text{ tree}$$

Observer function returns new data structure:

Definition

$$\begin{aligned} isin \ t \ a = & \\ (\text{let } t' = \text{splay } a \ t \ \text{in } & (\text{case } t' \ \text{of} \\ & \langle \rangle \Rightarrow \text{False} \\ & | \langle l, x, r \rangle \Rightarrow a = x, \\ & t')) \end{aligned}$$

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Solution 2:

$$isin = \text{splay}; is_root$$

Client uses *splay* before calling *is_root*:

Definition

$$\begin{aligned} is_root :: 'a \Rightarrow 'a \text{ tree} \Rightarrow \text{bool} \\ is_root \ x \ t = & (\text{case } t \ \text{of} \\ & \langle \rangle \Rightarrow \text{False} \\ & | \langle l, a, r \rangle \Rightarrow x = a) \end{aligned}$$

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Solution 2:

$$isin = \text{splay}; is_root$$

Client uses *splay* before calling *is_root*:

Definition

$$\begin{aligned} is_root :: 'a \Rightarrow 'a \text{ tree} \Rightarrow \text{bool} \\ is_root \ x \ t = & (\text{case } t \ \text{of} \\ & \langle \rangle \Rightarrow \text{False} \\ & | \langle l, a, r \rangle \Rightarrow x = a) \end{aligned}$$

May call *is_root* *t* multiple times (with the same *t*!) because *is_root* takes constant time

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isin

Splay trees have an imperative flavour and are a bit awkward to use in a purely functional language

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Sources

The inventors of splay trees:
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Self-adjusting Binary Search Trees. *J. ACM*, 1985.

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The formalization is based on
Berry Schoenmakers. *A Systematic Analysis of Splaying*.
Information Processing Letters, 1993.

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