

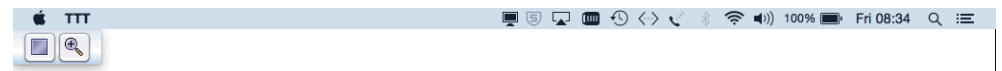
Script generated by TTT

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- 1 Correctness
- 2 Insertion Sort
- 3 Time
- 4 Merge Sort

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Principle: Count function calls

For every function $f :: \tau_1 \Rightarrow \dots \Rightarrow \tau_n \Rightarrow \tau$
define a *timing function* $t_f :: \tau_1 \Rightarrow \dots \Rightarrow \tau_n \Rightarrow \text{nat}$.



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Translation of defining equations:

$$\frac{e \rightsquigarrow e'}{f\ p_1 \dots p_n = e \rightsquigarrow t_f\ p_1 \dots p_n = e' + 1}$$



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Translation of expressions:

$$\frac{s_1 \rightsquigarrow t_1 \quad \dots \quad s_k \rightsquigarrow t_k}{g\ s_1 \dots s_k \rightsquigarrow t_1 + \dots + t_k + t_g\ s_1 \dots s_k}$$

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- Variable $\rightsquigarrow 0$, Constant $\rightsquigarrow 0$

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- Variable $\rightsquigarrow 0$, Constant $\rightsquigarrow 0$
- Constructor calls and primitive operations on *bool* and numbers cost 1

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Example

$\text{app} []\ ys = ys$

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Example

$$app [] ys = ys$$

\rightsquigarrow

$$t_app [] ys = 0 + 1$$

13



Example

$$app [] ys = ys$$

\rightsquigarrow

$$t_app [] ys = 0 + 1$$

$$app (x\#xs) ys = x \# app xs ys$$

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Example

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\rightsquigarrow

$$t_app [] ys = 0 + 1$$

$$app (x\#xs) ys = x \# app xs ys$$

\rightsquigarrow

$$t_app (x\#xs) ys = 0 + (0 + 0 + t_app xs ys) + 1 + 1$$

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A compact formulation of

$$e \rightsquigarrow t$$

t is the sum of all $t_g s_1 \dots s_k$
such that $g s_1 \dots s_n$ is a subterm of e

14



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t is the sum of all $t_g s_1 \dots s_k$
such that $g s_1 \dots s_n$ is a subterm of e

If g is

- a constructor or
- a predefined function on *bool* or numbers

then $t_g \dots = 1$.

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if and *case*

So far we model a call-by-value semantics

15



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Conditionals and case expressions are evaluated **lazily**.

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Translation:

$$\frac{b \rightsquigarrow t \quad s_1 \rightsquigarrow t_1 \quad s_2 \rightsquigarrow t_2}{\text{if } b \text{ then } s_1 \text{ else } s_2 \rightsquigarrow t + (\text{if } b \text{ then } t_1 \text{ else } t_2)}$$

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A compact formulation of $e \rightsquigarrow t$

t is the sum of all $t_g s_1 \dots s_k$
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$O(\cdot)$ is enough

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$O(\cdot)$ is enough

\implies Reduce all additive constants to 1

Example

$$t_{\text{app}} (x\#xs) ys = t_{\text{app}} xs ys + 1$$

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Discussion

- The definition of t_f from f can be automated.

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- The definition of t_f from f can be automated.
- The correctness of t_f could be proved w.r.t. a semantics that counts computation steps.

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Discussion

- The definition of t_f from f can be automated.
- The correctness of t_f could be proved w.r.t. a semantics that counts computation steps.
- Precise complexity bounds (as opposed to $O(\cdot)$) would require a formal model of (at least) the compiler and the hardware.

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Thys/Sorting.thy

Insertion sort complexity

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```
merge :: 'a list ⇒ 'a list ⇒ 'a list
```

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```
merge :: 'a list ⇒ 'a list ⇒ 'a list
```

```
merge [] ys = ys
```

```
merge xs [] = xs
```

```
merge (x # xs) (y # ys) =
```

```
(if x ≤ y then x # merge xs (y # ys)
```

```
else y # merge (x # xs) ys)
```

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(if x ≤ y then x # merge xs (y # ys)
```

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else y # merge (x # xs) ys)
```

```
msort :: 'a list ⇒ 'a list
```

```
msort xs =
```

```
(let n = length xs
```

```
in if n ≤ 1 then xs
```

```
else merge (msort (take (n div 2) xs))
```

```
(msort (drop (n div 2) xs)))
```

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Thys/Sorting.thy

Merge sort

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Chapter 7

Binary Trees

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HOL/Library/Tree.thy
Thys/Tree_Additions.thy

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Binary trees

```
datatype 'a tree = Leaf | Node ('a tree) 'a ('a tree)
```

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Tree traversal

```
inorder :: 'a tree  $\Rightarrow$  'a list
```

```
inorder  $\langle \rangle$  = []
```

```
inorder  $\langle l, x, r \rangle$  = inorder l @ [x] @ inorder r
```

```
preorder :: 'a tree  $\Rightarrow$  'a list
```

```
preorder  $\langle \rangle$  = []
```

```
preorder  $\langle l, x, r \rangle$  = x # preorder l @ preorder r
```

```
postorder :: 'a tree  $\Rightarrow$  'a list
```

```
postorder  $\langle \rangle$  = []
```

```
postorder  $\langle l, x, r \rangle$  = postorder l @ postorder r @ [x]
```

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Size

$size :: 'a\ tree \Rightarrow nat$

$|\langle \rangle| = 0$

$|\langle l, -, r \rangle| = |l| + |r| + 1$

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$size1 :: 'a\ tree \Rightarrow nat$

$|t|_1 = |t| + 1$

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$|\langle l, -, r \rangle| = |l| + |r| + 1$

$size1 :: 'a\ tree \Rightarrow nat$

$|t|_1 = |t| + 1$

\Rightarrow

$|\langle \rangle|_1 = 1$

$|\langle l, x, r \rangle|_1 = |l|_1 + |r|_1$

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Height

$height :: 'a\ tree \Rightarrow nat$

$h(\langle \rangle) = 0$

$h(\langle l, -, r \rangle) = \max (h(l)) (h(r)) + 1$

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Height

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Warning: $h(\cdot)$ only on slides

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Height

$height :: 'a\ tree \Rightarrow nat$

$h(\langle \rangle) = 0$

$h(\langle l, -, r \rangle) = \max (h(l)) (h(r)) + 1$

Warning: $h(\cdot)$ only on slides

Lemma $h(t) \leq |t|$

Lemma $|t|_1 \leq 2^{h(t)}$

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Minimal height

$min_height :: 'a\ tree \Rightarrow nat$

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Minimal height

$min_height :: 'a\ tree \Rightarrow nat$

$mh(\langle \rangle) = 0$

$mh(\langle l, -, r \rangle) = \min (mh(l)) (mh(r)) + 1$

31



Minimal height

$min_height :: 'a\ tree \Rightarrow nat$

$mh(\langle \rangle) = 0$

$mh(\langle l, -, r \rangle) = \min (mh(l)) (mh(r)) + 1$

Warning: $mh(.)$ only on slides

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Internal path length

$ipl :: 'a\ tree \Rightarrow nat$

$ipl \langle \rangle = 0$

$ipl \langle l, -, r \rangle = ipl\ l + |l| + ipl\ r + |r|$

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Internal path length

$ipl :: 'a\ tree \Rightarrow nat$

$ipl \langle \rangle = 0$

$ipl \langle l, -, r \rangle = ipl\ l + |l| + ipl\ r + |r|$

Why relevant?

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5 Binary Trees

6 Basic Functions

7 Complete and Balanced Trees



Complete tree

$complete :: 'a\ tree \Rightarrow bool$



Complete tree

$complete :: 'a\ tree \Rightarrow bool$

$complete \langle \rangle = True$

$complete \langle l, -, r \rangle =$

$(complete\ l \wedge complete\ r \wedge h(l) = h(r))$



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Lemma $complete\ t = (mh(t) = h(t))$



Complete tree

$complete :: 'a\ tree \Rightarrow bool$
 $complete \langle \rangle = True$
 $complete \langle l, _ , r \rangle =$
 $(complete\ l \wedge complete\ r \wedge h(l) = h(r))$

Lemma $complete\ t = (mh(t) = h(t))$

Lemma $complete\ t \Longrightarrow |t|_1 = 2^{h(t)}$

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Lemma $complete\ t \Longrightarrow |t|_1 = 2^{h(t)}$

Lemma $|t|_1 = 2^{h(t)} \Longrightarrow complete\ t$

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Lemma $|t|_1 = 2^{h(t)} \Longrightarrow complete\ t$

Lemma $|t|_1 = 2^{mh(t)} \Longrightarrow complete\ t$

Corollary $\neg complete\ t \Longrightarrow |t|_1 < 2^{h(t)}$

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Lemma $|t|_1 = 2^{h(t)} \implies complete\ t$

Lemma $|t|_1 = 2^{mh(t)} \implies complete\ t$

Corollary $\neg complete\ t \implies |t|_1 < 2^{h(t)}$

Corollary $\neg complete\ t \implies 2^{mh(t)} < |t|_1$

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Complete tree: *ipl*

Lemma A complete tree of height h has internal path length $(h - 2) * 2^h + 2$.

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Complete tree: *ipl*

Lemma A complete tree of height h has internal path length $(h - 2) * 2^h + 2$.

In a search tree, finding the node labelled x takes as many steps as the path from the root to x is long. Thus the average time to find an element that is in the tree is $ipl\ t / |t|$.

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Complete tree: *ipl*

Lemma A complete tree of height h has internal path length $(h - 2) * 2^h + 2$.

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Lemma Let t be a complete search tree of height h .

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Complete tree: ipl

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Lemma Let t be a complete search tree of height h . The average time to find a random element that is in the tree is asymptotically $h - 2$ (as h approaches ∞):

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Complete tree: ipl

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In a search tree, finding the node labelled x takes as many steps as the path from the root to x is long. Thus the average time to find an element that is in the tree is $ipl\ t / |t|$.

Lemma Let t be a complete search tree of height h . The average time to find a random element that is in the tree is asymptotically $h - 2$ (as h approaches ∞):

$$ipl\ t / |t| \sim h - 2$$

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Complete tree: ipl

A problem: $(h - 2) * 2^h + 2$ is only correct if interpreted over type int , not nat .

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Complete tree: ipl

A problem: $(h - 2) * 2^h + 2$ is only correct if interpreted over type int , not nat .

Correct version:

Lemma $complete\ t \implies$
 $int\ (ipl\ t) = (int\ (h(t)) - 2) * 2^{h(t)} + 2$

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Balanced tree

$balanced :: 'a\ tree \Rightarrow bool$

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Balanced tree

$balanced :: 'a\ tree \Rightarrow bool$
 $balanced\ t = (h(t) - mh(t) \leq 1)$

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Balanced tree

$balanced :: 'a\ tree \Rightarrow bool$
 $balanced\ t = (h(t) - mh(t) \leq 1)$

Balanced trees have optimal height:

Lemma *If $balanced\ t \wedge |t| \leq |t'|$ then $h(t) \leq h(t')$.*

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Warning

- The terms *complete* and *balanced* are not defined uniquely in the literature.

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Chapter 8

Search Trees

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Most of the material focuses on
BSTs = binary search trees

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BSTs represent sets

Any tree represents a set:

$set_tree :: 'a\ tree \Rightarrow 'a\ set$

$set_tree\ \langle \rangle = \{\}$

$set_tree\ \langle l, x, r \rangle = set_tree\ l \cup \{x\} \cup set_tree\ r$

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BSTs represent sets

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A BST represents a set that can be searched in time
 $O(h(t))$

42



BSTs represent sets

Any tree represents a set:

$$\text{set_tree} :: 'a \text{ tree} \Rightarrow 'a \text{ set}$$
$$\text{set_tree } \langle \rangle = \{\}$$
$$\text{set_tree } \langle l, x, r \rangle = \text{set_tree } l \cup \{x\} \cup \text{set_tree } r$$

A BST represents a set that can be searched in time $O(h(t))$

Function *set_tree* is called an *abstraction function* because it maps the implementation to the abstract mathematical object

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bst

$$\text{bst} :: 'a \text{ tree} \Rightarrow \text{bool}$$
$$\text{bst } \langle \rangle = \text{True}$$
$$\text{bst } \langle l, a, r \rangle =$$
$$(\text{bst } l \wedge \text{bst } r \wedge$$
$$(\forall x \in \text{set_tree } l. x < a) \wedge$$
$$(\forall x \in \text{set_tree } r. a < x))$$

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bst

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Type *'a* must be in class *linorder* (*'a* :: *linorder*) where *linorder* are *linear orders* (also called *total orders*).

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Type *'a* must be in class *linorder* (*'a* :: *linorder*) where *linorder* are *linear orders* (also called *total orders*).

Note: *nat*, *int* and *real* are in class *linorder*

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Set interface

An implementation of sets of elements of type $'a$ must provide

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Set interface

An implementation of sets of elements of type $'a$ must provide

- An implementation type $'s$

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Set interface

An implementation of sets of elements of type $'a$ must provide

- An implementation type $'s$
- $empty :: 's$
- $insert :: 'a \Rightarrow 's \Rightarrow 's$
- $delete :: 'a \Rightarrow 's \Rightarrow 's$
- $isin :: 's \Rightarrow 'a \Rightarrow bool$

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Map interface

Instead of a set, a search tree can also implement a **map** from $'a$ to $'b$:

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Map interface

Instead of a set, a search tree can also implement a **map** from $'a$ to $'b$:

- An implementation type $'m$
- $empty :: 'm$
- $update :: 'a \Rightarrow 'b \Rightarrow 'm \Rightarrow 'm$

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Map interface

Instead of a set, a search tree can also implement a **map** from $'a$ to $'b$:

- An implementation type $'m$
- $empty :: 'm$
- $update :: 'a \Rightarrow 'b \Rightarrow 'm \Rightarrow 'm$
- $delete :: 'a \Rightarrow 'm \Rightarrow 'm$
- $lookup :: 'm \Rightarrow 'a \Rightarrow 'b \text{ option}$

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Map interface

Instead of a set, a search tree can also implement a **map** from $'a$ to $'b$:

- An implementation type $'m$
- $empty :: 'm$
- $update :: 'a \Rightarrow 'b \Rightarrow 'm \Rightarrow 'm$
- $delete :: 'a \Rightarrow 'm \Rightarrow 'm$
- $lookup :: 'm \Rightarrow 'a \Rightarrow 'b \text{ option}$

Sets are a special case of maps

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Comparison of elements

We assume that the element type $'a$ is a linear order

Instead of using $<$ and \leq directly:

datatype $cmp_val = LT | EQ | GT$

$cmp\ x\ y =$
(if $x < y$ then LT else if $x = y$ then EQ else GT)

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Implementation

Implementation type: 'a tree

$empty = Leaf$

$insert\ x\ \langle\rangle = \langle\langle\rangle, x, \langle\rangle\rangle$

$insert\ x\ \langle l, a, r \rangle = (\text{case } cmp\ x\ a\ \text{of}$
 $\quad LT \Rightarrow \langle insert\ x\ l, a, r \rangle$
 $\quad | EQ \Rightarrow \langle l, a, r \rangle$
 $\quad | GT \Rightarrow \langle l, a, insert\ x\ r \rangle)$

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Implementation

$delete\ x\ \langle\rangle = \langle\rangle$

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Implementation

$delete\ x\ \langle\rangle = \langle\rangle$

$delete\ x\ \langle l, a, r \rangle =$

$(\text{case } cmp\ x\ a\ \text{of}$
 $\quad LT \Rightarrow \langle delete\ x\ l, a, r \rangle$
 $\quad | EQ \Rightarrow \text{if } r = \langle\rangle \text{ then } l$
 $\quad \quad \text{else let } (a', r') = del_min\ r \text{ in } \langle l, a', r' \rangle$
 $\quad | GT \Rightarrow \langle l, a, delete\ x\ r \rangle)$

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Implementation

$delete\ x\ \langle\rangle = \langle\rangle$

$delete\ x\ \langle l, a, r \rangle =$

$(\text{case } cmp\ x\ a\ \text{of}$
 $\quad LT \Rightarrow \langle delete\ x\ l, a, r \rangle$
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 $\quad | GT \Rightarrow \langle l, a, delete\ x\ r \rangle)$

$del_min\ \langle l, a, r \rangle =$

$(\text{if } l = \langle\rangle \text{ then } (a, r)$

$\quad \text{else let } (x, l') = del_min\ l \text{ in } (x, \langle l', a, r \rangle))$

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⑧ Unbalanced BST

Correctness

Correctness Proof Method Based on Sorted Lists

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Why is this implementation correct?

Because *empty insert delete isin*
 simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

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Because *empty insert delete isin*
 simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

set_tree empty = $\{\}$

52



Why is this implementation correct?

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 simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

set_tree empty = $\{\}$

set_tree (insert x t) = set_tree t \cup $\{x\}$

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Why is this implementation correct?

Because *empty insert delete isin*
simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

$set_tree\ empty = \{\}$
 $set_tree\ (insert\ x\ t) = set_tree\ t \cup \{x\}$
 $set_tree\ (delete\ x\ t) = set_tree\ t - \{x\}$

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Why is this implementation correct?

Because *empty insert delete isin*
simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

$set_tree\ empty = \{\}$
 $set_tree\ (insert\ x\ t) = set_tree\ t \cup \{x\}$
 $set_tree\ (delete\ x\ t) = set_tree\ t - \{x\}$
 $isin\ t\ x = (x \in set_tree\ t)$

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Why is this implementation correct?

Because *empty insert delete isin*
simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

$set_tree\ empty = \{\}$
 $set_tree\ (insert\ x\ t) = set_tree\ t \cup \{x\}$
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 $isin\ t\ x = (x \in set_tree\ t)$

Under the assumption *bst t*

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Also: *bst* must be invariant

bst empty
 $bst\ t \implies bst\ (insert\ x\ t)$
 $bst\ t \implies bst\ (delete\ x\ t)$

53



Also: *bst* must be invariant

bst empty

bst t \implies *bst (insert x t)*

bst t \implies *bst (delete x t)*



Why is this implementation correct?

Because *empty insert delete isin*
simulate $\{\}$ $\cup \{.\}$ $- \{.\}$ \in

set_tree empty = $\{\}$

set_tree (insert x t) = *set_tree t* $\cup \{x\}$

set_tree (delete x t) = *set_tree t* $- \{x\}$

isin t x = $(x \in \textit{set_tree t})$

Under the assumption