



Red-Black Trees

*Many invariants make quick
work*

15-150 M21

Lecture 0716
16 July 2021

0 Sets

$3 \in S1?$

> No

$5 \in S1?$

> Yes

$7 \in S1?$

> No

$S2 = \text{insert}(3, S1)$

$3 \in S2?$

> Yes

$5 \in S2?$

> Yes

$7 \in S2?$

> No

S1: ?

S2: ?

SET signature

aux-library/SET.sig

```
16 signature SET =  
17 sig  
18   structure Elt : EQ  
19  
20   type Set  
21  
22   val empty : Set  
23  
24   exception ExistingElt  
25   val insert : Elt.t * Set -> Set  
26   val overwrite : Elt.t * Set -> Set
```

REPL Demonstration:

Insert, Overwrite, and Lookup

aux-library/SET.sig

```
28   val remove : Elt.t * Set -> Set
29
30   val lookup : Set -> Elt.t -> Elt.t option
31
32   val union : Set -> Set -> Set
33
34   val toString : (Elt.t -> string) -> Set ->
35   string
end
```

Simple Version

aux-library/Set.sml

```
63 functor ListSet (Elt : EQ):>SET
```

aux-library/Set.sml

```
68 (* INVARIANT: S : Set contains no duplicates
69 * (according to Elt.equal) *)
70 type Set = Elt.t list
71
72 val empty = []
73
74 fun lookup [] y = NONE
75   | lookup (x::xs) y =
76     if (Elt.equal x y)
77     then SOME(x)
78     else lookup xs y
```

Towards a better
implementation: Adding a
sortedness invariant

aux-library/SET.sig

```
8 signature ORD =  
9 sig  
10   type t  
11  
12   (* INVARIANT: equal is a comparison function  
13   *)  
13   val cmp : t * t -> order  
14 end
```

Recall cmpEqual : ORD -> EQ

```
24 functor cmpEqual (K : ORD) : EQ =  
25 struct  
26   type t = K.t  
27   fun equal x y = K.cmp(x, y) = EQUAL  
28 end
```

aux-library/Set.sml

```
96 functor OrdListSet (EltOrd : ORD) :> SET
```

aux-library/Set.sml

```
99   structure Elt = cmpEqual(EltOrd)
100
101   (* INVARIANT: S : Set contains no duplicates
102   *   (according to Elt.equal) and is sorted
103   *   (according to EltOrd.cmp)
104   *)
104   type Set = Elt.t list
```

aux-library/Set.sml

```
108 fun lookup [] y = NONE
109   | lookup (x::xs) y =
110       case EltOrd.cmp(y,x) of
111         LESS => NONE
112         | EQUAL => SOME(x)
113         | GREATER => lookup xs y
```

3 ∈ S1?

> No

5 ∈ S1?

> Yes

7 ∈ S1?

> No

S2 = insert(3, S1)

3 ∈ S2?

> Yes

5 ∈ S2?

> Yes

7 ∈ S2?

> No

S1:

[1, 2, 4, 5, 6, 10, 11]

S2:

[1, 2, 3, 4, 5, 6, 10, 11]

One note about the code

- Want `Elt.t` to be transparent
- Want `Set` to be opaque

`aux-library/Set.sml`

```
96 functor OrdListSet (EltOrd : ORD) :> SET
97 where type Elt.t = EltOrd.t =
98 struct
```

Complexity

n is the number of elements in the set

	Work	Span
insert/overwrite	$O(n)$	$O(n)$
lookup	$O(n)$	$O(n)$

aux-library/Set.sml

```
144 functor OrdTreeSet (EltOrd : ORD) :> SET
145 where type Elt.t = EltOrd.t =
146 struct
147     structure Elt = cmpEqual(EltOrd)
148
149     (* INVARIANT: S : Set contains no duplicates
150      * (according to Elt.equal) and is sorted
151      * (according to EltOrd.cmp)
152      *)
152     type Set = Elt.t Tree.tree
```


$3 \in S1?$

> No

$5 \in S1?$

> Yes

$7 \in S1?$

> No

$S2 = \text{insert}(3, S1)$

$3 \in S2?$

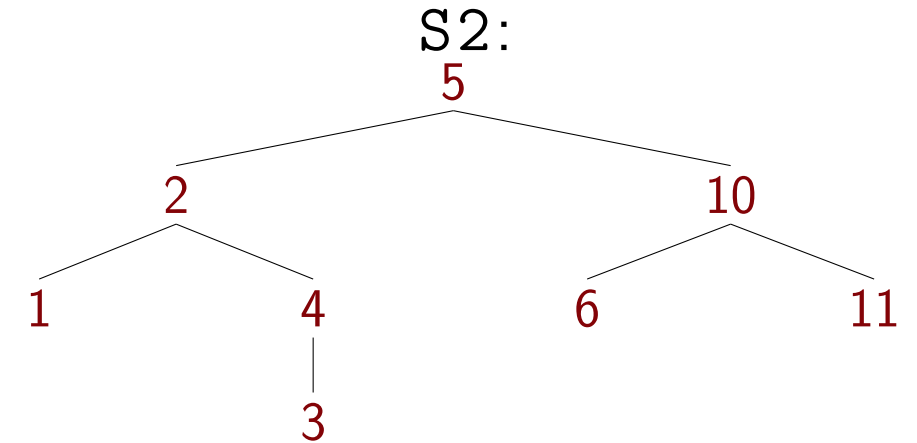
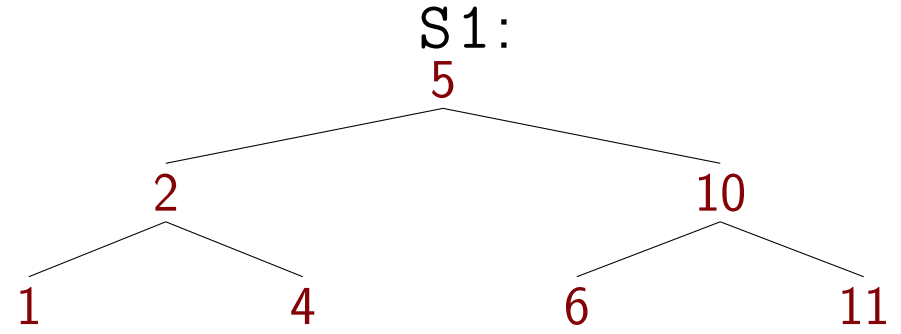
> Yes

$5 \in S2?$

> Yes

$7 \in S2?$

> No



Complexity

n is the number of elements in the set. Assume trees are balanced.

		Work	Span
OrdListSet	insert/overwrite	$O(n)$	$O(n)$
	lookup	$O(n)$	$O(n)$
OrdTreeSet	insert/overwrite	$O(\log n)$	$O(\log n)$
	lookup	$O(\log n)$	$O(\log n)$

1 Representation Independence

Claim:

A user won't be able to tell the difference between `OrdListSet` and `OrdTreeSet`

Idea of an RI Proof

Consider the expression

```
insert (2, insert (1, empty)) : Set
```

encoding the set $\{1, 2\}$.

Depending on whether we use the `ListSet`, `OrdListSet`, or `OrdTreeSet` implementation, we might get different values (of different types):

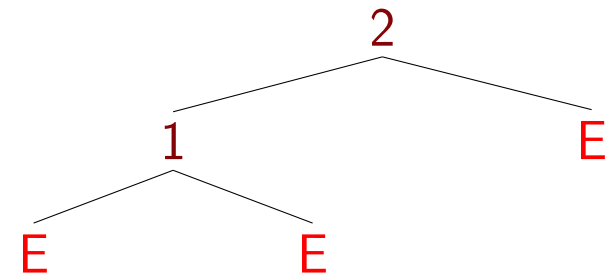
`ListSet`

`[2, 1]`

`OrdListSet`

`[1, 2]`

`OrdTreeSet`



Key Idea:

These represent the same value,
in their respective
implementations of Set

Making this idea precise

To prove the **representation independence** result between `OrdListSet` and `OrdTreeSet`, take an arbitrary `EltOrd : ORD` and let

```
structure OL = OrdListSet(EltOrd)
structure OT = OrdTreeSet(EltOrd)
```

And define a binary relation \mathcal{R} between the values of `OL.Set` and `OT.Set`, such that

$$\mathcal{R}(lS, tS) \iff \begin{array}{l} lS : \text{OL.Set} \text{ represents} \\ \text{the same set (using OL) that} \\ tS : \text{OT.Set} \text{ does (using} \\ \text{OT)} \end{array}$$

```
22  val empty : Set
23
24  exception ExistingElt
25  val insert : Elt.t * Set -> Set
26  val overwrite : Elt.t * Set -> Set
27
28  val remove : Elt.t * Set -> Set
29
30  val lookup : Set -> Elt.t -> Elt.t option
31
32  val union : Set -> Set -> Set
33
34  val toString : (Elt.t -> string) -> Set -> string
```


- $\mathcal{R}(\text{OL.empty}, \text{OT.empty})$
- If $\mathcal{R}(\text{ls}, \text{ts})$, then for any $x : \text{EltOrd.t}$,

$$\mathcal{R}(\text{OL.overwrite}(x, \text{ls}), \text{OT.overwrite}(x, \text{ts}))$$
- If $\mathcal{R}(\text{ls}, \text{ts})$, then for any $x : \text{EltOrd.t}$, either:
 - ▶ Both $\text{OL.insert}(x, \text{ls})$ and $\text{OT.insert}(x, \text{ts})$ raise their respective `ExistingElt` exceptions, or
 - ▶ $\mathcal{R}(\text{OL.insert}(x, \text{ls}), \text{OT.insert}(x, \text{ts}))$
- If $\mathcal{R}(\text{ls}, \text{ts})$, then for any $x : \text{Elt.t}$,

$$\text{OL.lookup ls } x \cong \text{OT.lookup ts } x$$
- **Check Your Understanding** (Analogously for `union` & `toString`)

The Point:

If all these things are true, then `OrdListSet` and
`OrdTreeSet` have
equivalent/indistinguishable/interchangeable behavior

OrdListSet: `type Set = Elt.t list`

OrdTreeSet: `type Set = Elt.t Tree.tree`

$$\mathcal{R}(lS, tS) \iff lS \cong (\text{inord } tS)$$

Prop. A tree T is sorted iff $(\text{inord } T)$ is sorted.

- $\mathcal{R}(OL.empty, OT.empty)$
- If $\mathcal{R}(lS, tS)$, then for any $x : \text{EltOrd}.t$,

$$\mathcal{R}(OL.overwrite(x, lS), OT.overwrite(x, tS))$$
- If $\mathcal{R}(lS, tS)$, then for any $x : \text{EltOrd}.t$, either:
 - ▶ Both $OL.insert(x, lS)$ and $OT.insert(x, tS)$ raise their respective `ExistingElt` exceptions, or
 - ▶ $\mathcal{R}(OL.insert(x, lS), OT.insert(x, tS))$
- If $\mathcal{R}(lS, tS)$, then for any $x : \text{Elt}.t$,

$$OL.lookup\ lS\ x \cong OT.lookup\ tS\ x$$
- Analogously for `union` & `toString`

Proof Sketch: overwrite case

- $\mathcal{R}(OL.empty, OT.empty)$
- If $\mathcal{R}(lS, tS)$, then for any $x : \text{EltOrd}.t$,
 - $\mathcal{R}(OL.overwrite(x, lS), OT.overwrite(x, tS))$
- If $\mathcal{R}(lS, tS)$, then for any $x : \text{EltOrd}.t$, either:
 - ▶ Both $OL.insert(x, lS)$ and $OT.insert(x, tS)$ raise their respective `ExistingElt` exceptions, or
 - ▶ $\mathcal{R}(OL.insert(x, lS), OT.insert(x, tS))$
- If $\mathcal{R}(lS, tS)$, then for any $x : \text{Elt}.t$,
 - $OL.lookup\ lS\ x \cong OT.lookup\ tS\ x$
- Analogously for `union` & `toString`

5-minute break

2 Dictionaries and Red-Black Trees

0716.0 (DICT.sig)

```
21 signature DICT =
22 sig
23   structure Key : EQ
24
25   type 'a entry = Key.t * 'a
26   type 'a dict
27
28   val empty : 'a dict
29
30   exception ExistingEntry
31   val insert : 'a entry * 'a dict -> 'a dict
32   val overwrite : 'a entry * 'a dict -> 'a dict
33   val lookup : 'a dict -> Key.t -> 'a option
```

0716.1 (dict.sml)

```
16 functor RBDict (KeyOrd : ORD) :> DICT
17   where type Key.t = KeyOrd.t =
18 struct
```

REPL Demonstration:

RBDict

0716.1 (dict.sml)

```
16 functor RBDict (KeyOrd : ORD) :> DICT
17   where type Key.t = KeyOrd.t =
18 struct
19   structure Key = cmpEqual(KeyOrd)
20   type 'a entry = Key.t * 'a
```

0716.2 (dict.sml)

```
24 datatype 'a dict =  
25     Empty  
26 | Red  of 'a dict * 'a entry * 'a dict  
27 | Black of 'a dict * 'a entry * 'a dict
```

```
31  val empty = Empty
32
33  fun lookup d k' =
34    let
35      fun lk (Empty) = NONE
36        | lk (Red tree) = lk' tree
37        | lk (Black tree) = lk' tree
38      and lk' (L, (k,v), R) =
39        (case KeyOrd.cmp(k',k)
40         of EQUAL => SOME(v)
41          | LESS => lk L
42           | GREATER => lk R)
43    in
44      lk d
45    end
```

Defn. A value $T : t\ dict$ is said to be a **red-black tree (RBT)** if it satisfies three conditions:

1. T is sorted by its keys

(either $T = \text{Empty}$; or

$(T = \text{Red}(L, (k, v), R)$ or $T = \text{Black}(L, (k, v), R)$ such that L and R are sorted by k is $\text{KeyOrd}. \text{cmp-greater-than-or-equal}$ to the key k' of any entry (k', v') in L and k is $\text{KeyOrd}. \text{cmp-less-than-or-equal}$ to any key in R))

2. For any **Red** node in T , both its children are black (**Empty** is considered black)

3. Every path from the root of T to its leaves contains the same number of black nodes, called the *black height* of T

Demonstration:

RBT-preseving insert


```

fun overwrite (entry, Empty) =
  Red(Empty, entry, Empty)
| overwrite ((k', v'), Red(L, (k, v), R)) =
  case Key.cmp(k', k) of
    LESS => Red(overwrite((k', v'), L), (k, v), R)
  | EQUAL => Red(L, (k', v'), R)
  | GREATER => Red(L, (k, v), overwrite((k', v'), R))
| overwrite ((k', v'), Black(L, (k, v), R)) =
  case Key.cmp(k', k) of
    LESS => Black(overwrite((k', v'), L), (k, v), R)
  | EQUAL => Black(L, (k', v'), R)
  | GREATER => Black(L, (k, v), overwrite((k', v'), R))

```

Problem

In the Red case: the recursive call to `overwrite((k',v'),L)` could return a Red node, so `overwrite` would produce a Red root with a Red child

Defn. A value $T : t \text{ dict}$ is said to be an **almost red-black tree (ARBT)** if it satisfies three conditions:

1. T is sorted by its keys
2. For any* Red node in T , both its children are black (Empty is considered black)

* *except for maybe the root*

3. Every path from the root of T to its leaves contains the same number of black nodes, called the *black height* of T

`restoreLeft : 'a dict -> 'a dict`

REQUIRES: Either `D` is an RBT, or `Black(L, e, R)` where `L` is an ARBT and `R` is an RBT

ENSURES: `restoreLeft(D)` is an RBT with the same entries as `D` and the same black height

`restoreRight : 'a dict -> 'a dict`

REQUIRES: Either `D` is an RBT, or `Black(L, e, R)` where `L` is an RBT and `R` is an ARBT

ENSURES: `restoreLeft(D)` is an RBT with the same entries as `D` and the same black height

Code Review: `overwrite`
`and insert`

If we have an `e : t dict` entry in scope, define

```
helpero : t dict -> t dict
```

REQUIRES: `D` is an RBT

ENSURES: `helpero D` evaluates to `D'` containing all the entries of `D`, plus `e` (replacing any existing entry in `D` whose key is `Key.equal` to the key of `e`). `D'` is an RBT if the root of `D` is `Black`, and `D'` is an ARBT if the root of `D` is `Red`.

Check Your Understanding

Write the spec of `helper`.

- Prove equivalence of two structures ascribing to the same signature by relating values representing the same structure
- Carefully invariants and dutifully maintain them, using the opacity of the modules system to prevent the user from breaking them

- Start *Applications* portion of course
- Parallel data structures and algorithms

Thank you!