

# Datastructures

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# Data Structures

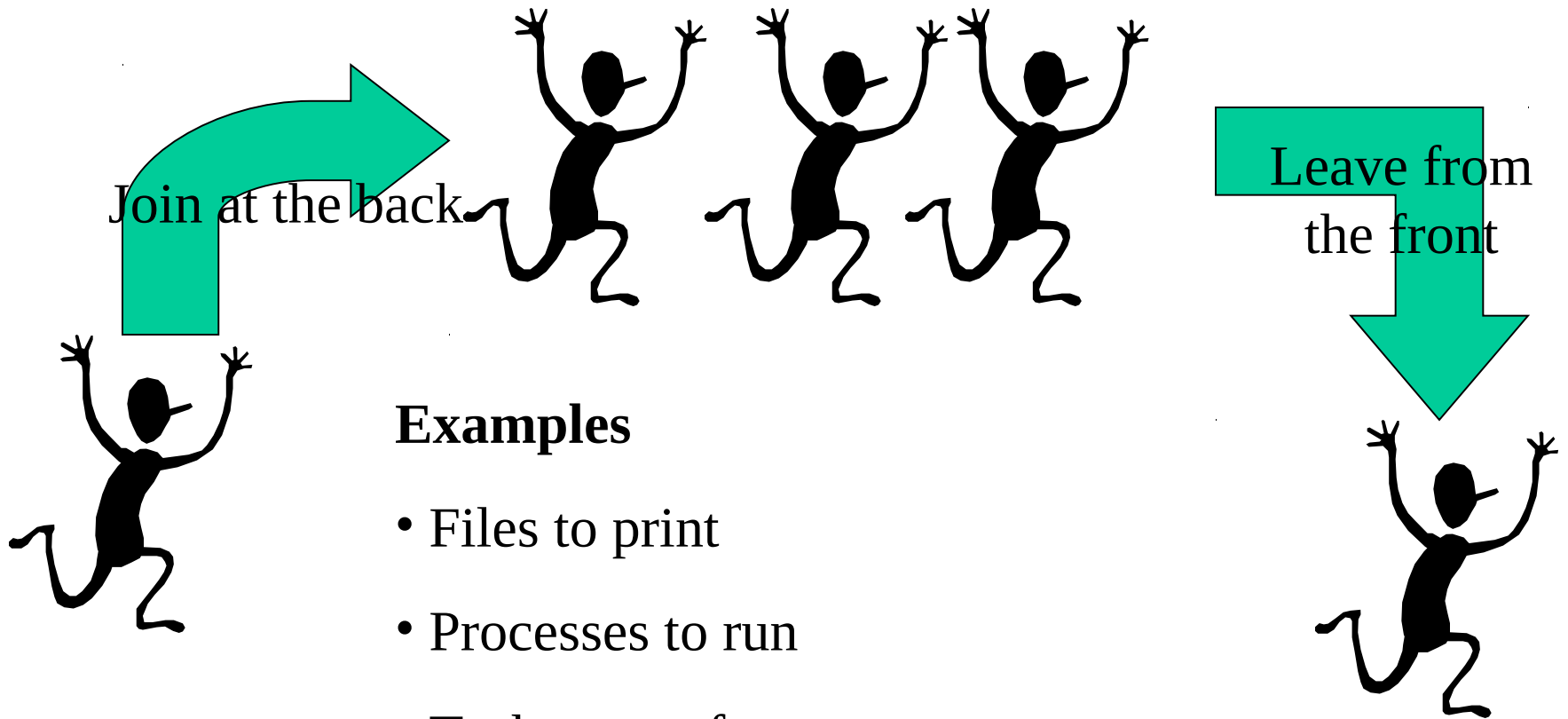
- Datatype
  - A model of something that we want to represent in our program
- Data structure
  - A particular way of *storing* data
  - How? Depending on what we want to do with the data
- Today: Two examples
  - Queues
  - Tables

# Using QuickCheck to Develop Fast Queue Operations

What we're going to do:

- Explain what a *queue* is, and give *slow* implementations of the queue operations, to act as a specification.
- Explain the idea behind the fast implementation.
- Formulate properties that say the fast implementation is "correct".
- Test them with QuickCheck.

# What is a Queue?



## Examples

- Files to print
- Processes to run
- Tasks to perform

# What is a Queue?

A *queue* contains a sequence of values. We can add elements at the back, and remove elements from the front.

We'll implement the following operations:

```
empty    :: Q a           -- an empty queue
add      :: a -> Q a -> Q a -- add an element at the back
remove   :: Q a -> Q a     -- remove an element from the front
front    :: Q a -> a       -- inspect the front element
isEmpty  :: Q a -> Bool    -- check if the queue is empty
```

new  
type

# First Try

```
data Q a = Q [a] deriving (Eq, Show)
```

```
empty = Q []
```

```
add x (Q xs) = Q (xs++[x])
```

```
remove (Q (x:xs)) = Q xs
```

```
front (Q (x:xs)) = x
```

```
isEmpty (Q xs) = null xs
```

# Works, but slow

$\text{add } x \text{ (Q } xs) = \text{Q } (xs++[x])$

$[] \quad ++ \text{ } ys = ys$

$(x:xs) ++ \text{ } ys = x : (xs++ys)$

As many recursive calls as there are elements in  $xs$

Add 1, add 2, add 3, add 4, add 5...

Time is the *square* of the number of additions

# A Module

- Implement the result in a *module*
- Use as specification
- Allows the re-use
  - By other programmers
  - Of the same names



# SlowQueue Module

**module** SlowQueue **where**

**data** Q a = Q [a] **deriving** (Eq, Show)

empty = Q []

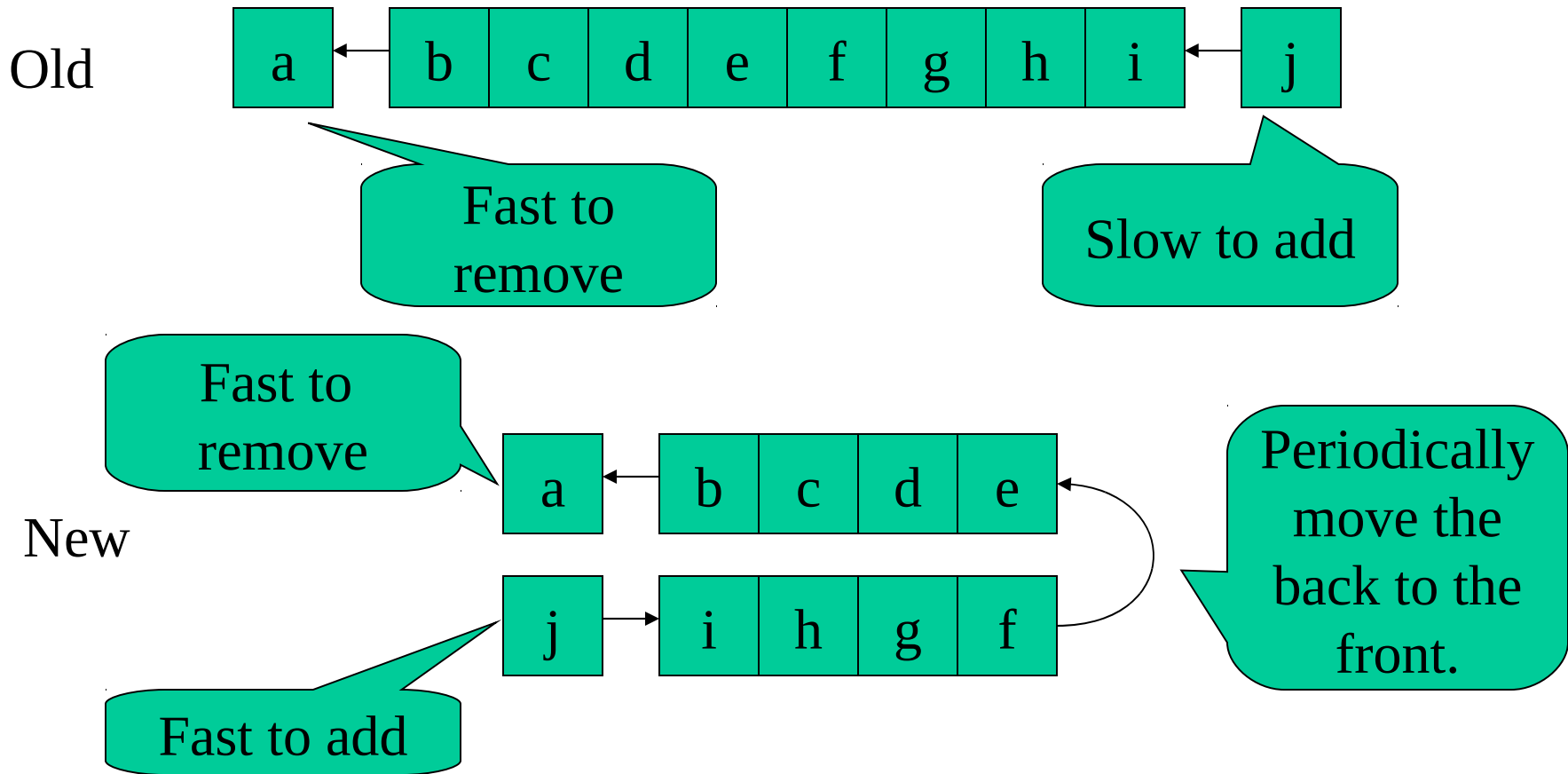
add x (Q xs) = Q (xs++[x])

remove (Q (x:xs)) = Q xs

front (Q (x:xs)) = x

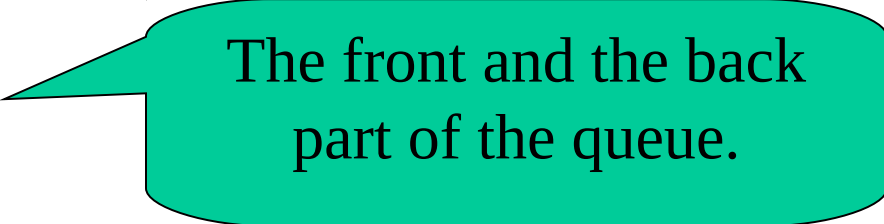
isEmpty (Q xs) = null xs

# New Idea: Store the Front and Back Separately



# Fast Datatype

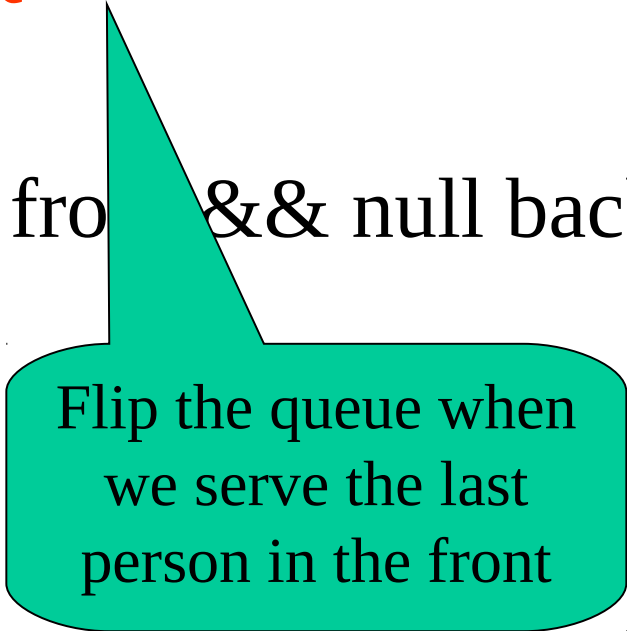
**data** Q a = Q [a] [a]  
**deriving** (Eq, Show)



The front and the back  
part of the queue.

# Fast Operations

empty = Q [] []  
add x (Q front back) = Q front (x:back)  
remove (Q (x:front) back) = **fixQ** front back  
front (Q (x:front) back) = x  
isEmpty (Q front back) = null front && null back



Flip the queue when  
we serve the last  
person in the front

# Smart Constructor

```
fixQ []    back = Q (reverse back) []
```

```
fixQ front back = Q front back
```

This takes *one function call per element* in the back—each element is inserted into the back (one call), flipped (one call), and removed from the front (one call)

# How can we test the fast functions?

- By using the original implementation as a *reference*
- The behaviour should be "the same"
  - Check results
- First version is an *abstract model* that is "obviously correct"

# Comparing the Implementations

- They operate on different *types* of queues
- To compare, must convert between them
  - Can we convert a slow Q to a Q?
    - Where should we split the front from the back???
  - Can we convert a Q to a slow Q?

contents (Q front back) = Q (front++reverse back)

- Retrieve the simple "model" contents from the implementation

# Accessing modules

```
import qualified SlowQueue as Slow
```

```
contents :: Q Int -> Slow.Q Int
```

```
contents (Q front back) =
```

```
    Slow.Q (front ++ reverse back)
```



*Qualified name*



# The Properties

The behaviour is the same, except for type conversion

prop\_Empty =

contents empty == Slow.empty

prop\_Add x q =

contents (add x q) == Slow.add x (contents q)

prop\_Remove q =

contents (remove q) == Slow.remove (contents q)

prop\_Front q =

front q == Slow.front (contents q)

prop\_IsEmpty q =

isEmpty q == Slow.isEmpty (contents q)

# Generating Qs

```
instance Arbitrary a => Arbitrary (Q a) where  
  arbitrary = do front <- arbitrary  
               back <- arbitrary  
               return (Q front back)
```

# A Bug!

```
Queues> quickCheck prop_Remove
```

```
*** Failed! Exception: 'Queue.hs:22:0-42: Non-exhaustive patterns in  
function remove' (after 1 test):
```

```
Q [] []
```

# Preconditions

- A condition that *must hold* before a function is called

prop\_remove q =

**not (isEmpty q) ==>**

retrieve (remove q) == remove (retrieve q)

prop\_front q =

**not (isEmpty q) ==>**

front q == front (retrieve q)

- Useful to be precise about these

# Another Bug!

```
Queues> quickCheck prop_Remove
```

```
*** Failed! Exception: 'Queue.hs:22:0-42:  
Non-exhaustive patterns in function  
remove' (after 2 tests):
```

```
Q [] [-1,0]
```



But this ought not to happen!

# An Invariant

- Q values ought *never* to have an empty front, and a non-empty back!
- Formulate an *invariant*  
invariant (Q front back) =  
not (null front && not (null back))

# Testing the Invariant

```
prop_Invariant :: Q Int -> Bool
```

```
prop_Invariant q = invariant q
```

- Of course, it fails...

```
Queues> quickCheck prop_invariant
```

```
Falsifiable, after 4 tests:
```

```
Q [] [-1]
```

# Fixing the Generator

```
instance Arbitrary a => Arbitrary (Q a) where  
  arbitrary = do front <- arbitrary  
               back <- arbitrary  
               return (Q front  
                       (if null front then [] else back))
```

- Now prop\_Invariant passes the tests



# Testing the Invariant

- We've *written down* the invariant
- We've seen to it that we only generate valid Qs as *test data*
- We must ensure that the *queue functions* only build valid Q values!
  - It is at this stage that the invariant is most useful

# Invariant Properties

prop\_Empty\_Inv =

invariant empty

prop\_Add\_Inv x q =

invariant (add x q)

prop\_Remove\_Inv q =

not (isEmpty q) ==>

invariant (remove q)

# A Bug in the Q operations!

```
Queues> quickCheck prop_Add_Inv
```

```
Falsifiable, after 2 tests:
```

```
0
```

```
Q [] []
```

```
Queues> add 0 (Q [] [])
```

```
Q [] [0]
```



The invariant is False!

# Fixing add

add x (Q front back) = **fixQ** front (x:back)

- We must flip the queue when *the first element is inserted* into an empty queue
- Previous bugs were in our understanding (our properties)—this one is in our implementation code

# Summary

- Data structures *store data*
- Obeying an *invariant*
- ... that functions and operations
  - can make use of (to search faster)
  - have to respect (to not break the invariant)
- Writing down and testing invariants and properties is a good way of finding errors

# Another Datastructure: Tables

A *table* holds a collection of *keys* and associated *values*.

For example, a phone book is a table whose keys are names, and whose values are telephone numbers.

**Problem:** Given a table and a key, find the associated value.

John Hughes	1001
Mary Sheeran	1013
Koen Claessen	5424
Hans Svensson	1079

# Table Lookup Using Lists

Since a table may contain any kind of keys and values, define a parameterised type:

E.g. `[("x",1), ("y",2)] :: Table String Int`

**type** Table a b = [(a, b)]

lookup "y" ...  
→ Just 2

lookup :: Eq a => a -> Table a b -> Maybe b

lookup "z" ...  
→ Nothing

# Finding Keys Fast

Finding keys by searching from the beginning is slow!

A better method:

look somewhere in the middle, and then look backwards or forwards depending on what you find.

(This assumes the table is sorted).

Claessen?

Aaboen A	
Nilsson Hans	
Östvall Eva	



# Representing Tables

We must be able to break up a table fast, into:

- A smaller table of entries before the middle one,
- the middle entry,
- a table of entries after it.

**data** Table a b =

Join (Table a b) a b (Table a b)

Aaboen A	

Nilsson Hans	
--------------	--

Östvall Eva	

# Quiz

What's wrong with this (recursive) type?

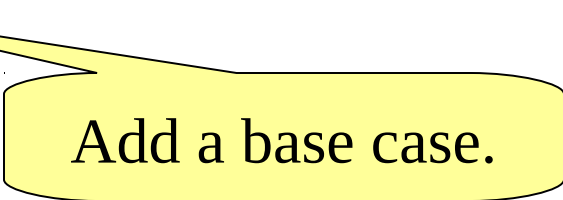
**data** Table a b = Join (Table a b) a b (Table a b)

# Quiz

What's wrong with this (recursive) type? No base case!

```
data Table a b = Join (Table a b) a b (Table a b)
```

```
| Empty
```



Add a base case.

# Looking Up a Key

To look up a key in a table:

- If the table is empty, then the key is not found.
- Compare the key with the key of the middle element.
- If they are equal, return the associated value.
- If the key is less than the key in the middle, look in the first half of the table.
- If the key is greater than the key in the middle, look in the second half of the table.

# Quiz

Define

```
lookupT :: Ord a => a -> Table a b -> Maybe b
```

Recall

```
data Table a b = Join (Table a b) a b (Table a b)  
                | Empty
```

# Quiz

Define

`lookupT :: Ord a => a -> Table a b -> Maybe b`

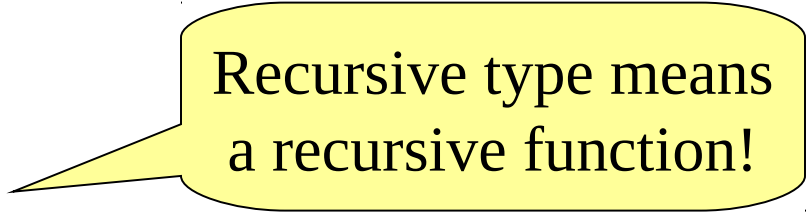
`lookupT key Empty = Nothing`

`lookupT key (Join left k v right)`

`| key == k = Just v`

`| key < k = lookupT key left`

`| key > k = lookupT key right`



Recursive type means  
a recursive function!

# Inserting a New Key

We also need function to build tables. We define

$$\text{insertT} :: \text{Ord } a \Rightarrow a \rightarrow b \rightarrow \text{Table } a \ b \rightarrow \text{Table } a \ b$$

to insert a new key and value into a table.

We must be careful to insert the new entry in the right place, so that the keys remain in order.

*Idea:* Compare the new key against the middle one. Insert into the first or second half as appropriate.

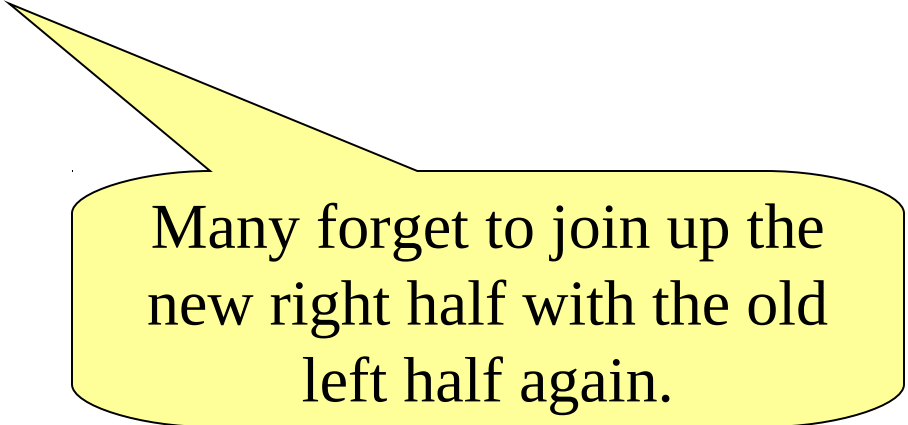
# Defining Insert

`insertT key val Empty = Join Empty key val Empty`

`insertT key val (Join left k v right)`

`| key <= k = Join (insertT key val left) k v right`

`| key > k = Join left k v (insertT key val right)`



Many forget to join up the new right half with the old left half again.



# Efficiency

On average, how many comparisons does it take to find a key in a table of 1000 entries, using a list and using the new method?

Using a list: 500

Using the new method: 10

# Testing

- How should we test the Table operations?
  - By comparison with the list operations

```
prop_LookupT k t =  
  lookupT k t == lookup k (contents t)  
prop_InsertT k v t =  
  insert (k,v) (contents t) == contents (insertT k v t)
```

Table a b  
->  
[(a,b)]

# Generating Random Tables

- Recursive types need recursive generators  
**instance** (Arbitrary a, Arbitrary b) =>

Arbitrary (Table a b) **where**

We can generate arbitrary  
Tables...

...provided we can generate  
keys and values

# Generating Random Tables

- Recursive types need recursive generators

**instance** (Arbitrary a, Arbitrary b) =>

Arbitrary (Table a b) **where**

arbitrary = oneof [ return Empty,

**do** k <- arbitrary

v <- arbitrary

left <- arbitrary

right <- arbitrary

return (Join left k v right) ]

Quiz:

What is wrong with  
this generator?

# Controlling the Size of Tables

- Generate tables with *at most n elements*

```
table s = frequency [(1, return Empty),  
                    (s, do k <- arbitrary  
                        v <- arbitrary  
                        l <- table (s `div` 2)  
                        r <- table (s `div` 2)  
                        return (Join l k v r))]
```

```
instance (Arbitrary a, Arbitrary b) =>  
         Arbitrary (Table a b) where  
         arbitrary = sized table
```

# Testing Table Properties

```
prop_LookupT k t = lookupT k t == lookup k (contents t)
```

```
Main> quickCheck prop_LookupT
```

```
Falsifiable, after 10 tests:
```

```
0
```

```
Join Empty 2 (-2) (Join Empty 0 0 Empty)
```

```
Main> contents (Join Empty 2 (-2) ...)
```

```
[(2,-2),(0,0)]
```

What's wrong?

# Tables must be Ordered!

```
prop_InvTable :: Table Integer Integer -> Bool
prop_InvTable t = ordered ks
  where ks = [k | (k,v) <- contents t]
```

- Tables should satisfy an important *invariant*.

```
Main> quickCheck prop_InvTable
Falsifiable, after 4 tests:
Join Empty 3 3 (Join Empty 0 3 Empty)
```

# How to Generate Ordered Tables?

- Generate a random list,
  - Take the *first* (key,value) to be at the root
  - Take all the *smaller* keys to go in the left subtree
  - Take all the *larger* keys to go in the right subtree



# Converting a List to a Table

```
-- table kvs converts a list of key-value pairs into a Table
-- satisfying the ordering invariant
table :: Ord key => [(key,val)] -> Table key val
table []           = Empty
table ((k,v):kvs) = Join (table [(k',v') | (k',v') <- kvs, k' <= k])
                        k v
                        (table [(k',v') | (k',v') <- kvs, k' > k])
```

# Generating Ordered Tables

Keys must have an ordering

```
instance (Ord a, Arbitrary a, Arbitrary b) =>  
          Arbitrary (Table a b) where  
  arbitrary = do xys <- arbitrary  
                return (table xys)
```

List of keys  
and values

# Testing the Properties

- Now the invariant holds, but the properties don't!

```
Main> quickCheck prop_InvTable
```

```
OK, passed 100 tests.
```

```
Main> quickCheck prop_LookupT
```

```
Falsifiable, after 7 tests:
```

```
-1
```

```
Join (Join Empty (-1) (-2) Empty) (-1) (-1) Empty
```

# More Testing

```
prop_InsertT k v t =  
  insert (k,v) (contents t)  
  == contents (insertT k v t)
```

```
Main> quickCheck prop_InsertT  
Falsifiable, after 8 tests:  
0  
0  
Join Empty 0 (-1) Empty
```

What's  
wrong?

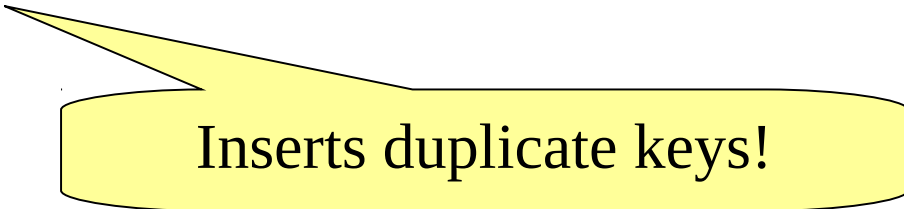
# The Bug

insert key val Empty = Join Empty key val Empty

insert key val (Join left k v right) =

| key  $\leq$  k = Join (insert key val left) k v right

| key > k = Join left k v (insert key val right)



Inserts duplicate keys!

# The Fix

`insertT key val Empty = Join Empty key val Empty`

`insertT key val (Join left k v right) =`

`| key < k = Join (insertT key val left) k v right`

`| key == k = Join left k val right`

`| key > k = Join left k v (insertT key val right)`

```
prop_InvTable :: Table Integer Integer -> Bool
```

```
prop_InvTable t = ordered ks && ks == nub ks
```

```
  where ks = [k | (k,v) <- contents t]
```

(and fix the table generator)

# Testing Again

```
Main> quickCheck prop_InsertT
```

```
Falsifiable, after 6 tests:
```

```
-2
```

```
2
```

```
Join Empty (-2) 1 Empty
```

# Testing Again

```
Main> quickCheck prop_InsertT
```

```
Falsifiable, after 6 tests:
```

```
-2
```

```
2
```

```
Join Empty (-2) 1 Empty
```

```
Main> insertT (-2) 2 (Join Empty (-2) 1 Empty)
```

```
Join Empty (-2) 2 Empty
```



# Testing Again

```
Main> quickCheck prop_insertT
```

```
Falsifiable, after 6 tests:
```

```
-2
```

```
2
```

```
Join Empty (-2) 1 Empty
```

```
Main> insertT (-2) 2 (Join Empty (-2) 1 Empty)
```

```
Join Empty (-2) 2 Empty
```

```
Main> insert (-2,2) [(-2,1)]
```

```
[(-2,1),(-2,2)]
```

insert doesn't *remove* the old key-value pair when keys clash—the wrong model!

# Summary

- Recursive data-types can store data in different ways
- Clever choices of datatypes and algorithms can improve performance dramatically
- Careful thought about *invariants* is needed to get such algorithms right!
- Formulating properties and invariants, and testing them, reveals bugs early