

SEARCHING

SYMBOL TABLES & BINARY SEARCH TREES

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THE SYMBOL TABLE CONCEPT

EXTENDING ARRAYS*

- In an array, an index (a number) corresponds to some value.
 - Terminology: call the index a **key**.
- It would be useful to extend this idea: map any type of key to values.
- This is a ***symbol table***:
 - Insert: put(Key, Value) – associates a value with a key.
 - Search: get(Key) – returns the last value inserted with Key, null if missing.
- You may already be familiar with this idea from using dictionaries in Python.

*Don't throw away arrays after learning symbol tables. Arrays tend to match a computer's architecture and perform better when using integers and resizing is not needed.

USING A SYMBOL TABLE

//simple:

```
SymbolTable<Integer, String> titles = new SymbolTable();  
title.put(222, "Data Structures & Algorithms");
```

```
title.get(222); //returns "Data Structures & Algorithms"
```

The book gives a few examples of using symbol tables.

Really though, symbol tables are extensions of arrays – they have a million uses and a chart isn't needed.

application	purpose of search	key	value
<i>dictionary</i>	find definition	word	definition
<i>book index</i>	find relevant pages	term	list of page numbers
<i>file share</i>	find song to download	name of song	computer ID
<i>account management</i>	process transactions	account number	transaction details
<i>web search</i>	find relevant web pages	keyword	list of page names
<i>compiler</i>	find type and value	variable name	type and value

Typical symbol-table applications

We'll do one example in depth:

Compilers

SIMPLE SYMBOL TABLE API

```
public class ST<Key, Value>
```

ST()	<i>create a symbol table</i>
void put(Key key, Value val)	<i>put key-value pair into the table (remove key from table if value is null)</i>
Value get(Key key)	<i>value paired with key (null if key is absent)</i>
void delete(Key key)	<i>remove key (and its value) from table</i>
boolean contains(Key key)	<i>is there a value paired with key?</i>
boolean isEmpty()	<i>is the table empty?</i>
int size()	<i>number of key-value pairs in the table</i>
Iterable<Key> keys()	<i>all the keys in the table</i>

API for a generic basic symbol table

- Should a key correspond to more than one value?
- Should we allow values to be null?
- What order is the iterator returned from keys() in?
- Should Keys be mutable or immutable?
- Should Values be mutable or immutable?

APPLICATIONS IN COMPILERS

- As a standard part of most compilers, a symbol table of variables is built.
- The compiler indexes each variable in a method and uses it as a key to store the value assigned to it.
- This is useful since it gives us a place to work with the values/expressions within the variables.
- One of the more interesting uses is *Value Propagation*.

```
void compute_z() {  
    int x = 2;  
    int y = x + 5;  
    int z = (y + x) * 2;  
    System.out.println(z);  
}
```

Variable	Value
x : int	Constant: 2
y : int	Expr: x + 5
z : int	Expr: (y + x) * 2

VALUE PROPAGATION

```
String compute_z() {  
    int x = 2;  
    int y = x + 5;  
    int z = (y + x) * 2;  
    System.out.println(z);  
}
```

Imagine that we are filling in the symbol table. Let us follow these rules:

- If RHS is a constant, store the constant.
- If RHS is an expression, store by:
 - trying to replace any variables with the values they contain in the symbol table*
 - trying to compute operators with constant operands.

Variable	Value
x : int	Constant: 2
y : int	
z : int	

For y: $x+5 \rightarrow 2+5 \rightarrow 7$

Variable	Value
x : int	Constant: 2
y : int	Constant: 7
z : int	

For z: $(y+x)*2 \rightarrow (2+7)*2 \rightarrow 18$

Variable	Value
x : int	Constant: 2
y : int	Constant: 7
z : int	Constant: 18

Compile can remove x and y, and do $z = 18$.

*For the record, this can only happen if there is only one assignment of a variable before it is used in an expression.

ORDERED API

- Of course, we might want to know about values in terms of their order defined by keys.
- Ordered symbol tables give us this functionality.
- The methods with the red bar are new.

<u>public class ST<Key extends Comparable<Key>, Value></u>		
ST()		<i>create an ordered symbol table</i>
void put(Key key, Value val)		<i>put key-value pair into the table (remove key from table if value is null)</i>
Value get(Key key)		<i>value paired with key (null if key is absent)</i>
void delete(Key key)		<i>remove key (and its value) from table</i>
boolean contains(Key key)		<i>is there a value paired with key?</i>
boolean isEmpty()		<i>is the table empty?</i>
int size()		<i>number of key-value pairs</i>
Key min()		<i>smallest key</i>
Key max()		<i>largest key</i>
Key floor(Key key)		<i>largest key less than or equal to key</i>
Key ceiling(Key key)		<i>smallest key greater than or equal to key</i>
int rank(Key key)		<i>number of keys less than key</i>
Key select(int k)		<i>key of rank k</i>
void deleteMin()		<i>delete smallest key</i>
void deleteMax()		<i>delete largest key</i>
int size(Key lo, Key hi)		<i>number of keys in [lo..hi]</i>
Iterable<Key> keys(Key lo, Key hi)		<i>keys in [lo..hi], in sorted order</i>
Iterable<Key> keys()		<i>all keys in the table, in sorted order</i>

API for a generic ordered symbol table

ORDERED SYMBOL TABLES: METHODS

	<i>keys</i>	<i>values</i>
<code>min()</code> →	09:00:00	Chicago
	09:00:03	Phoenix
	09:00:13	Houston
<code>get(09:00:13)</code> →	09:00:59	Chicago
	09:01:10	Houston
<code>floor(09:05:00)</code> →	09:03:13	Chicago
	09:10:11	Seattle
<code>select(7)</code> →	09:10:25	Seattle
	09:14:25	Phoenix
	09:19:32	Chicago
	09:19:46	Chicago
<code>keys(09:15:00, 09:25:00)</code> →	09:21:05	Chicago
	09:22:43	Seattle
	09:22:54	Seattle
	09:25:52	Chicago
<code>ceiling(09:30:00)</code> →	09:35:21	Chicago
	09:36:14	Seattle
<code>max()</code> →	09:37:44	Phoenix

`size(09:15:00, 09:25:00)` is 5
`rank(09:10:25)` is 7

ORDERED SYMBOL TABLES: BEST PRICES

```
//simple:
```

```
SymbolTable prices = new SymbolTable();
prices.put(857, new Flight(AirChina, "931"));
prices.put(816, new Flight(United, "7301"));
prices.put(897, new Flight(Asiana, "5040"));
prices.put(980, new Flight(SkyWest, "7301"));
prices.put(817, new Flight(AirChina, "987"));
```

```
for(Integer i : prices.keys(0, 850))
    System.out.println(bst.get(i));
```

```
//will print out flights up to 850, in order.
```

The screenshot shows the KAYAK website interface for a flight search from Phoenix (PHX) to Seoul (SEL). The search parameters are set for Dec 9 to Dec 16, Economy class, 1 traveler. The results are sorted by price (low to high). The first three results are all priced at \$816 and are Webjet flights. Each result shows a flight from Air China with a stop in Phoenix (PHX) and a final destination in Seoul (SEL). The flight times and airlines are listed for each option. The interface also includes a sidebar with filters for stops, times, airports, and airlines.

KAYAK HOTELS FLIGHTS CARS PACKAGES TRIPS

PHX ↔ SEL Dec 9 → Dec 16 Economy 1
988 of 1201 flights Wednesday Wednesday cabin traveler [Change](#)

Sort by: price (low to high) Round-trip Segment [new](#)

\$816
Webjet

Select Air China
8:26a PHX → 9:45p GMP 21h 19m 2 stops (SFO, PEK)
6:10p ICN → 12:18a PHX 22h 08m 2 stops (PEK, LAX)
\$817 Expedia \$817 CheapOair \$817 Travelocity
\$817 ExploreTrip
Show details Economy
United operates flight 7301, 7305
SkyWest Airlines operates flight 7302
Air China operates flight 131, 135, 983

\$816
Webjet

Select Air China
8:26a PHX → 9:45p GMP 21h 19m 2 stops (SFO, PEK)
9:30a GMP → 12:18a PHX 30h 48m 2 stops (PEK, LAX)
\$817 Expedia \$817 Travelocity \$867 CheapOair
\$817 ExploreTrip
Show details Economy
United operates flight 7301, 7305
SkyWest Airlines operates flight 7302
Air China operates flight 131, 135, 983

\$816
Webjet

Select Air China
8:26a PHX → 11:50a ICN 35h 24m 2 stops (SFO, PEK)
6:10p ICN → 12:18a PHX 22h 08m 2 stops (PEK, LAX)
\$868 KAYAK \$867 JustFly \$867 CheapTickets...
\$867 Orbitz \$867 Priceline Q Expedia
Show details Economy
United operates flight 7301, 7305
SkyWest Airlines operates flight 7302
Air China operates flight 131, 135, 983

\$817
Expedia

Filters:

Stops:
☐ nonstop
☒ 1 stop \$1293
☒ 2+ stops \$816

Times:
Take-off Phoenix (PHX)
Wed 12:00a - Thu 12:00a
Take-off Seoul (SEL)
Wed 12:00a - Thu 12:00a
Show landing times

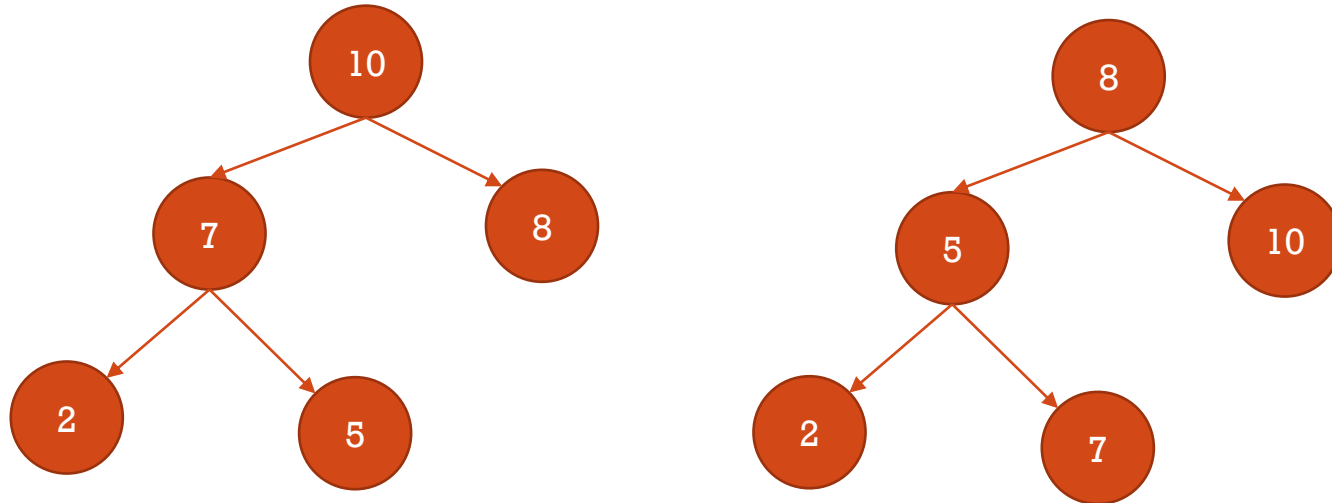
Airports:
☐ Depart/Return same
Phoenix
☒ PHX: Sky Harbor ... \$816
Seoul
☒ GMP: Gimpo Intl \$816
☒ ICN: Incheon Intl ... \$816

Airlines:
Carrier | Alliance
☒ Air Canada \$1285
☒ Air China \$816
☒ Air France \$1983
☒ Alitalia \$7783
☒ American Airlines \$1692
☒ ANA \$1320
☒ Asiana Airlines \$1378
☒ British Airways \$2869
☒ Cathay Pacific \$1614
☒ China Airlines \$1292
☒ China Eastern Air \$1770
☒ China Southern \$1137
☒ Delta \$1445
☒ Emirates \$1867
☒ Etihad Airways \$3348
☒ Finnair \$2274
☒ Japan Airlines \$1542
☒ KLM \$4460
☒ Korean Air \$1473
☒ Major Airline \$1822
☒ Qatar Airways \$1893
☒ Singapore Airlines \$2963



BINARY SEARCH TREES

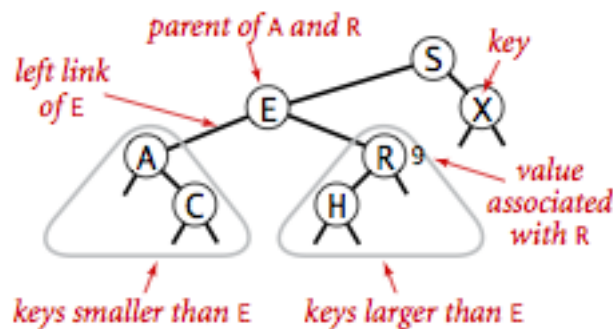
HEAPS TO BINARY SEARCH TREES



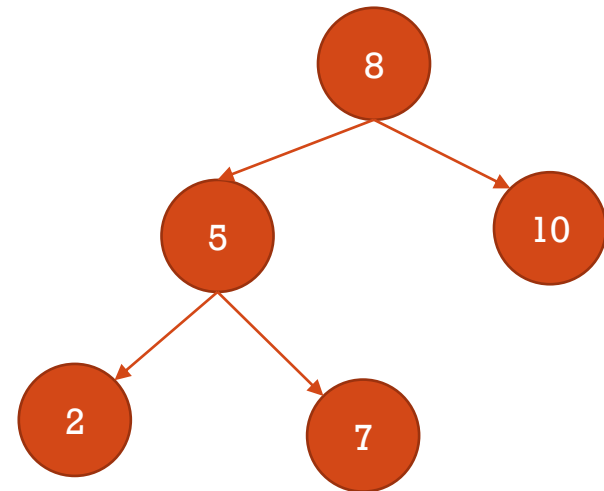
- In the last chapter, we discussed heaps as a way to structure data in a priority queue.
- Now we'll use BSTs which are a little more restrictive.
- Are heaps BSTs? Vice versa?
- Side note: one requirement of symbol tables is that each key maps to exactly one value. This useful in our implementations since we can assume the elements are distinct.

THE CONCEPT

- **Definition:** A *binary tree* is a tree where each node has at most two children.
- **Definition:** A *binary search tree* is a binary tree where each node's left child has a key less than the parent, and the right child has a key greater than the parent.



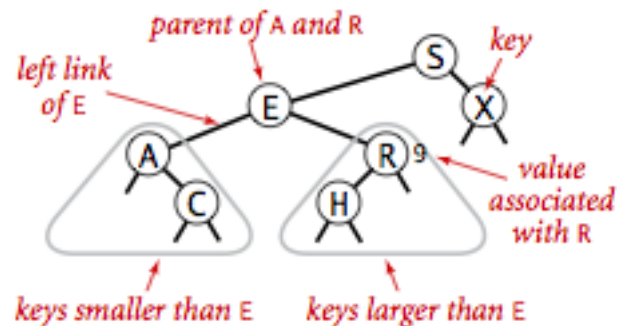
Anatomy of a binary search tree



THE CONCEPT

- **Recursive Definition:** a node is the root of a BST if:
 - A left child has a key less than the parent, and the child is the root of a BST.
 - A right child has a key greater than the parent, and the child is the root of a BST.

- So... what?



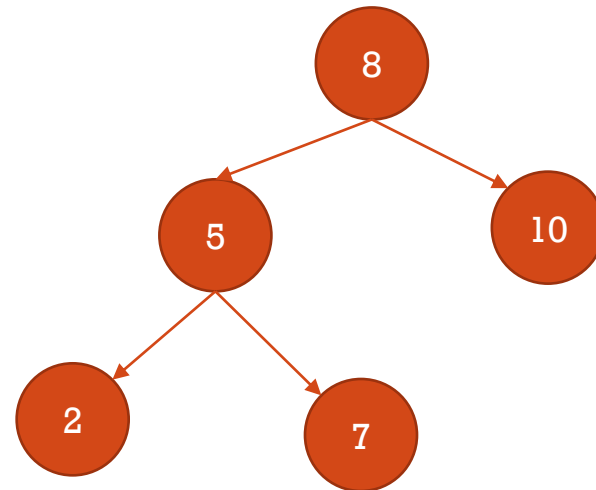
Anatomy of a binary search tree

TRAVERSING TREES

- A common operation performed on trees is to visit all of their nodes. To explore a non-linear structure, we need rules to systematically explore the structure and be sure we don't miss any nodes.
 - How does this compare to exploring a linked list?
- There are three main algorithms for doing this:
 - **Preorder(root):**
visit root, preorder(root.left), preorder(root.right)
 - **Inorder(root):**
inorder(root.left), visit root, inorder(root.right)
 - **Postorder(root):**
postorder(root.left), postorder(root.right), visit root

TRAVERSING TREES

- **Preorder(root):**
visit root, preorder(root.left), preorder(root.right)





IMPLEMENTATION

ORDERED SYMBOL TABLE

We're going to implement the whole thing – a ordered symbol table:

<u>public class ST<Key extends Comparable<Key>, Value></u>		
ST()		<i>create an ordered symbol table</i>
void put(Key key, Value val)		<i>put key-value pair into the table (remove key from table if value is null)</i>
Value get(Key key)		<i>value paired with key (null if key is absent)</i>
void delete(Key key)		<i>remove key (and its value) from table</i>
boolean contains(Key key)		<i>is there a value paired with key?</i>
boolean isEmpty()		<i>is the table empty?</i>
int size()		<i>number of key-value pairs</i>
Key min()		<i>smallest key</i>
Key max()		<i>largest key</i>
Key floor(Key key)		<i>largest key less than or equal to key</i>
Key ceiling(Key key)		<i>smallest key greater than or equal to key</i>
int rank(Key key)		<i>number of keys less than key</i>
Key select(int k)		<i>key of rank k</i>
void deleteMin()		<i>delete smallest key</i>
void deleteMax()		<i>delete largest key</i>
int size(Key lo, Key hi)		<i>number of keys in [lo..hi]</i>
Iterable<Key> keys(Key lo, Key hi)		<i>keys in [lo..hi], in sorted order</i>
Iterable<Key> keys()		<i>all keys in the table, in sorted order</i>

API for a generic ordered symbol table

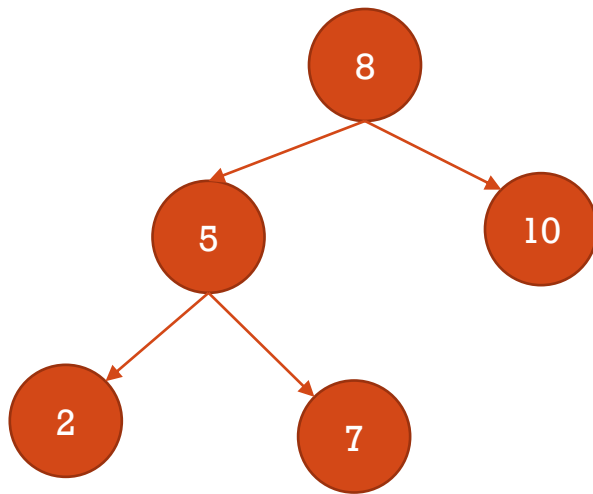
BST REPRESENTATION

- In the vernacular of the discussion we had during priority queues: we will represent our symbol table as a binary search tree and structure it as a binary tree.
- Each node will be a linked node with three references, a value, and a size.

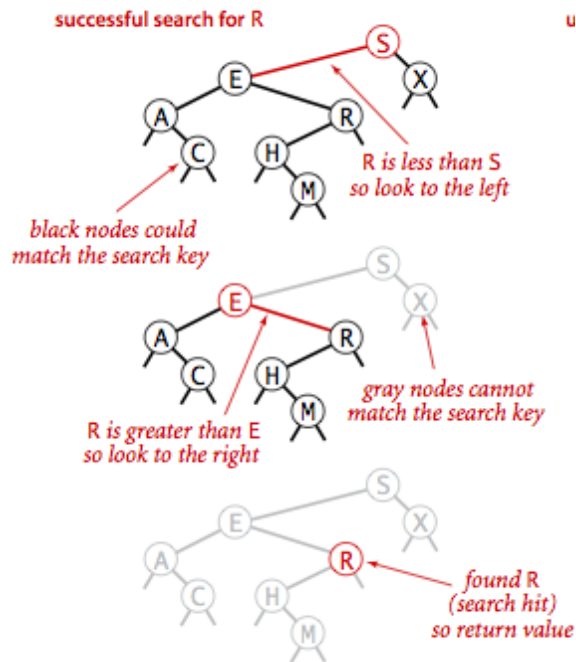
```
private class Node {  
    private final Key key;  
    private Value val;  
    private Node left, right;  
    private int N;  
  
    public Node(Key key, Value val, int N) {  
        this.key = key;  
        this.val = val;  
        this.N = N;  
    }  
}
```

GET() IN BSTS

- Per the API, we need to get “value paired with key”.



GET() IMPLEMENTATION



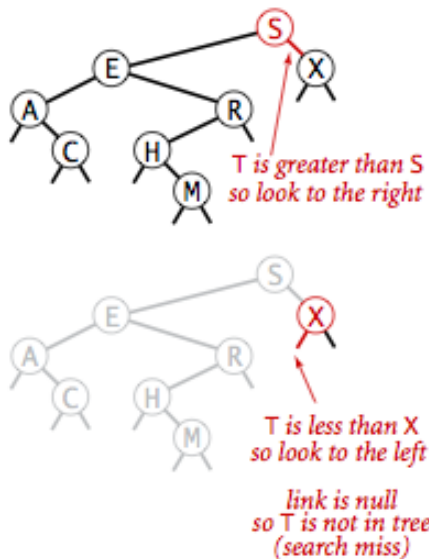
successful search

```
public Value get(Key key) {
    return get(root, key);
}
```

```
private Value get(Node x, Key key) {
    if (x == null)
        return null;
    int cmp = key.compareTo(x.key);
    if (cmp < 0)
        return get(x.left, key);
    else if (cmp > 0)
        return get(x.right, key);
    else return x.val;
}
```

GET() IMPLEMENTATION

unsuccessful search for T



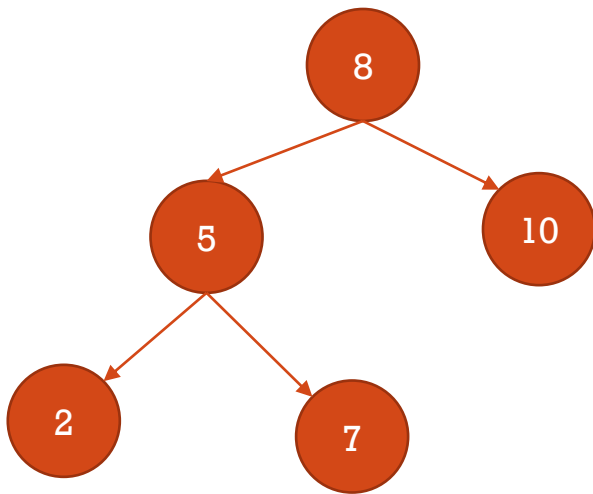
unsuccessful search

```
public Value get(Key key) {  
    return get(root, key);  
}
```

```
private Value get(Node x, Key key) {  
    if (x == null)  
        return null;  
    int cmp = key.compareTo(x.key);  
    if (cmp < 0)  
        return get(x.left, key);  
    else if (cmp > 0)  
        return get(x.right, key);  
    else return x.val;  
}
```

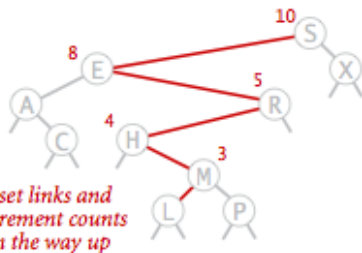
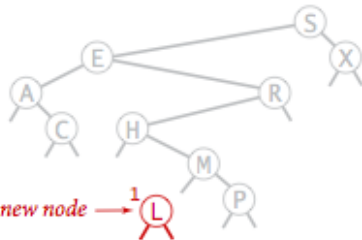
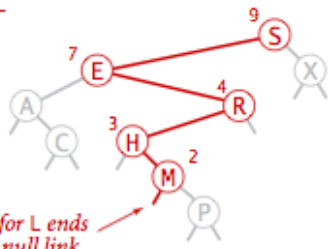
PUT() IN BSTS

- Per the API, we need to “put a key-value pair into the table”.



PUT() IMPLEMENTATION

inserting L



Insertion into a BST

```
public void put(Key key, Value val) {
    root = put(root, key, val);
}

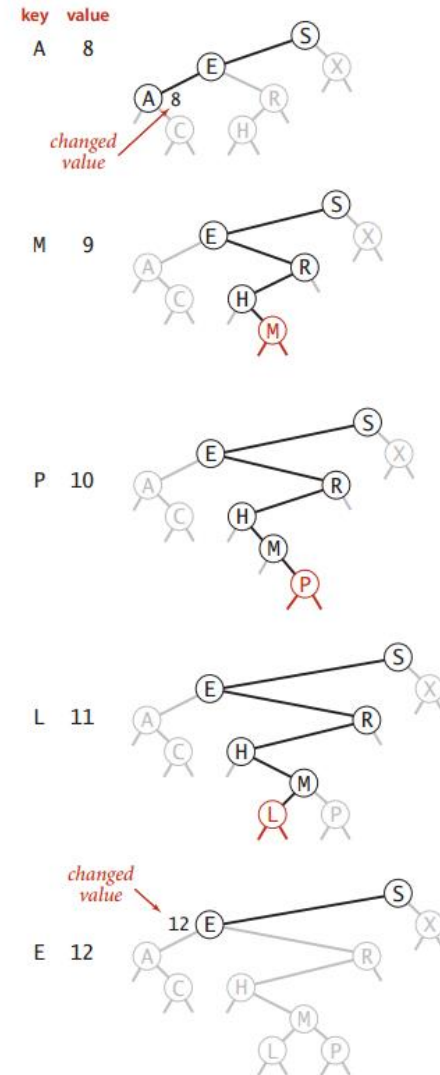
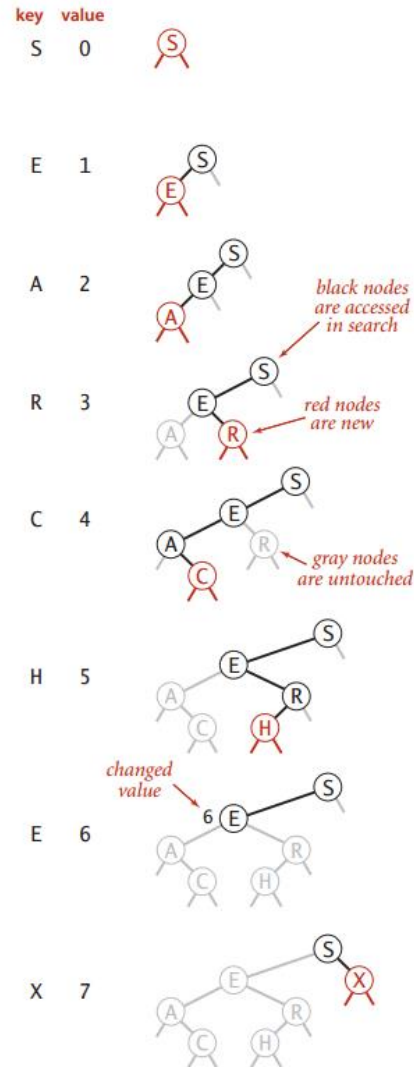
private Node put(Node x, Key key, Value val) {
    if (x == null)
        return new Node(key, val, 1);

    int cmp = key.compareTo(x.key);
    if (cmp < 0)
        x.left = put(x.left, key, val);
    else if (cmp > 0)
        x.right = put(x.right, key, val);
    else
        x.val = val;
    x.N = size(x.left) + size(x.right) + 1;

    return x;
}
```


BST TRACE

One general concern: how will the resultant tree look?



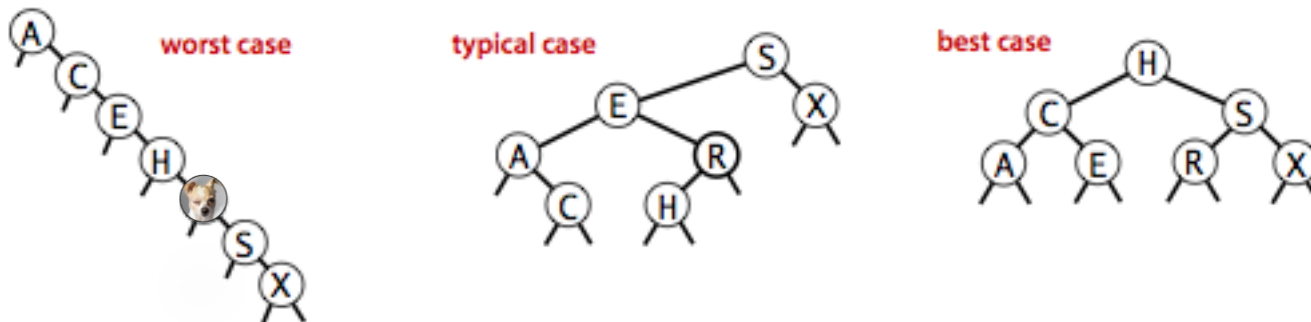
BST LAYOUT

There three cases for layout of a tree:

Worse case: a stilted tree.

Typical case: in between the other two cases.

Best case: a balanced tree.



We will focus on the typical (average) case for a successful search where we count comparisons.

- Where do unsuccessful searches and inserts fit in?
- Any guesses for the worse or best case Big-Oh right now?

The average case will be defined as a tree where the domain of keys is randomly inserted.

AVERAGE ANALYSIS FOR BST

Proof:

The sum of the depth of all nodes is the *internal path length*, call it C_N .

The average cost of a search hit is then:

- $1 + \frac{C_N}{N}$

As initial values, we have $C_0 = C_1 = 0$. We now want to write C_N :

- $N - 1$ (every node other than the root has to cross the root's edge)
- $((C_0 + C_{N-1}) + (C_1 + C_{N-2}) + \dots + (C_{N-1} + C_0)) / N$ (take the average of possible subtrees)

The textbook rewrites as:

- $C_N = N - 1 + (C_0 + C_{N-1}) / N + (C_1 + C_{N-2}) / N + \dots + (C_{N-1} + C_0) / N$

a complete expression that looks like the quicksort recurrence.

We'll skip the algebra on this one:

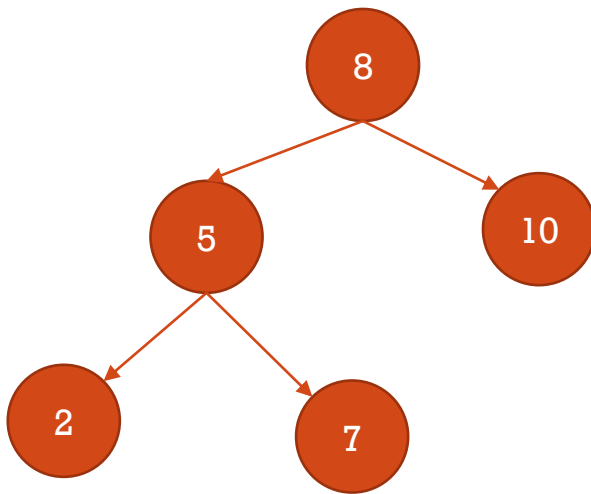
- $C_N \sim 2N \ln N$

We can now evaluate our original expression, $1 + \frac{C_N}{N}$:

- $1 + \frac{2N \ln N}{N} \sim 2 \ln N \approx 1.39 \lg N$

MIN() IN BSTS

- Per the API, we need to find the “smallest key”.



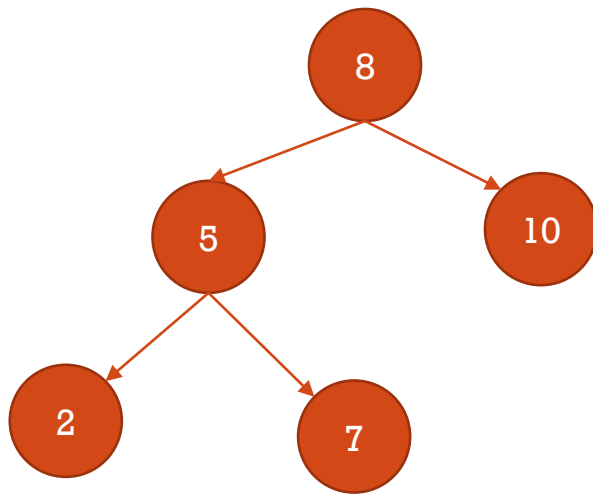
MIN() IMPLEMENTATION

- Finding the min is simple, just move left until you cannot do so.

```
public Key min() {  
    return min(root).key;  
}  
  
private Node min(Node x) {  
    if (x.left == null)  
        return x;  
    return min(x.left);  
}
```

DELETEMIN() IN BSTS

- Per the API, we need to “delete smallest key”.

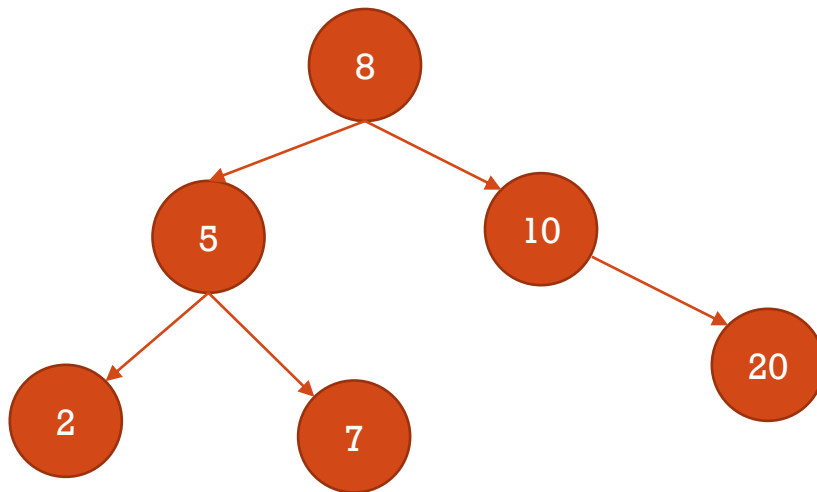


DELETMIN() IMPLEMENTATION

```
public void deleteMin() {  
    root = deleteMin(root);  
}  
  
private Node deleteMin(Node x) {  
    if (x.left == null) return x.right;  
    x.left = deleteMin(x.left);  
    x.N = size(x.left) + size(x.right) + 1;  
    return x;  
}
```

DELETE() IN BSTS

- Per the API, we need to “remove key (and value) from table”.
- This will be our most complicated method – there are actually three different cases to handle (explicitly or implicitly).



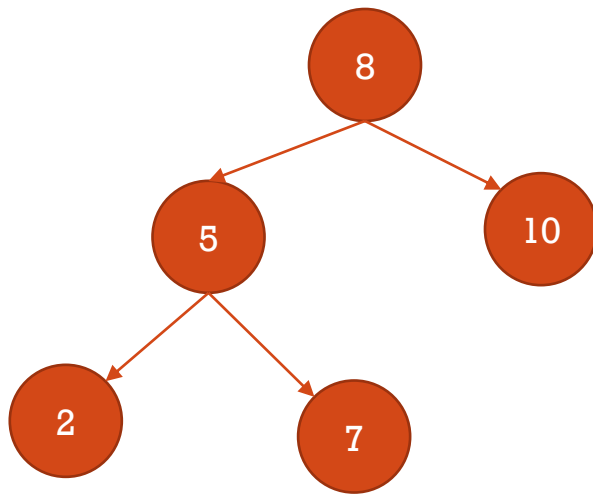
DELETE() IMPLEMENTATION

```
public void delete(Key key) {
    root = delete(root, key);
}

private Node delete(Node x, Key key) {
    if (x == null) return null;
    int cmp = key.compareTo(x.key);
    if (cmp < 0) x.left = delete(x.left, key);
    else if (cmp > 0) x.right = delete(x.right, key);
    else
    {
        if (x.right == null) return x.left;
        if (x.left == null) return x.right;
        Node t = x;
        x = min(t.right);
        x.right = deleteMin(t.right);
        x.left = t.left;
    }
    x.N = size(x.left) + size(x.right) + 1;
    return x;
}
```

KEYS() IN BSTS

- Per the API, we need to find all the “keys in [lo..hi]”.



KEYS() IMPLEMENTATION

```
public Iterable<Key> keys(Key lo, Key hi) {  
    Queue<Key> queue = new LinkedList<>();  
    keys(root, queue, lo, hi);  
    return queue;  
}  
  
private void keys(Node x, Queue<Key> queue, Key lo, Key hi) {  
    if (x == null) return;  
    int cmplo = lo.compareTo(x.key);  
    int cmphi = hi.compareTo(x.key);  
    if (cmplo < 0) keys(x.left, queue, lo, hi);  
    if (cmplo <= 0 && cmphi >= 0) queue.add(x.key);  
    if (cmphi > 0) keys(x.right, queue, lo, hi);  
}
```

PERFORMANCE SUMMARY

Algorithm (data structure)	avg: search hit	avg: insert	Efficiently support ordered operations?
sequential search (unordered linked list)	$N/2$	N	No
binary search (ordered array)	$\lg N$	N	Yes
binary search trees	$1.39 \lg N$	$1.39 \lg N$	Yes