

# IE170: Algorithms in Systems Engineering: Lecture 6

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## Taking Stock

### Last Time

- Divide-and-Conquer
- The Master-Theorem
- When the World Will End

### This Time

- Master Theorem Practice
- Some Sorting Algs.
- Data Structures



## The Master Theorem

- If recurrence has the form

$$T(n) = \begin{cases} \Theta(1) & n = 1 \\ aT(n/b) + f(n) & n > 1 \end{cases}$$

- The **Master Theorem** tells us how to analyze it:
  - If  $f \in O(n^{\log_b a - \epsilon})$ , for some constant  $\epsilon > 0$ , then  $T \in \Theta(n^{\log_b a})$ .
  - If  $f \in \Theta(n^{\log_b a})$ , then  $T \in \Theta(n^{\log_b a} \lg n)$ .
  - If  $f \in \Omega(n^{\log_b a + \epsilon})$ , for some constant  $\epsilon > 0$ , and if  $af(n/b) \leq cf(n)$  for some constant  $c < 1$  and  $n > n_0$ , then  $T \in \Theta(f)$ .



## Some More Examples...

- Here we will do a couple examples of the master theorem
- Also I will show you a little trick (substitution) that can come in handy – especially if you have  $\sqrt{\cdot}$ .

### Not Fun!

- Homework 2.2-1: and **prove** that it has that form.
- Do **all** of 4.1



## Fun!

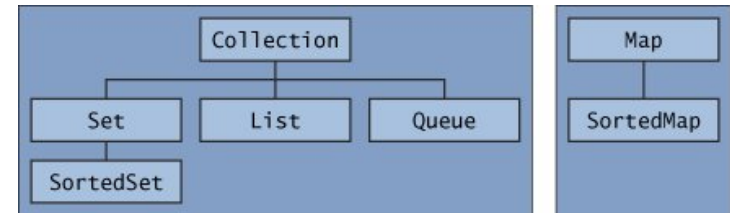
## Simple Sorting Algorithms:

- Merge Sort:
  - Divide the list into smaller pieces. Sort the small pieces. Then merge together sorted lists.
- Insertion Sort:
  - Insert item  $j$  into  $A[0 \dots j - 1]$
- Selection Sort
  - Find  $j^{\text{th}}$  smallest element and put it in  $A[j]$
- Bubble sort:
  - Start at end of array: If  $A[j] < A[j - 1]$ , swap them



## The Java Collections Interfaces

- In the remainder of the class, we will be using the Java Collections Interface: <http://java.sun.com/docs/books/tutorial/collections/TOC.html>
- **Important:** Most of what I will say only works if you set the "code level" to Java 5.0 in eclipse!
- The interfaces form a hierarchy:



## (A subset of) the Collections Interface

```

public interface Collection<E> extends Iterable<E> {
    // Basic operations
    int size();
    boolean isEmpty();
    boolean contains(Object element);
    boolean add(E element); //optional
    boolean remove(Object element); //optional
    Iterator<E> iterator();

    // Array operations
    Object[] toArray();
    <T> T[] toArray(T[] a);
}
  
```



## Traversing Collections

- Use for-each construct:
 

```

for (Object o : collection)
    System.out.println(o);
      
```
- Use an iterator. (Can remove() items with iterator)
 

```

for(Iterator<String> i= words.iterator(); i.hasNext(); ){
    System.out.println(i.next());
}
      
```
- hasNext(): returns true if the iteration has more elements,
- next(): returns the next element in the iteration.
- remove(): removes the last element that was returned by next from the underlying Collection.



## Converting to Array

- Sometimes you need to convert a collection to an array:  
`Object[] a = c.toArray();`



## Set

- A Set is a Collection that cannot contain duplicate elements.
- It models the mathematical set abstraction.
- The Set interface contains only methods inherited from Collection and adds the restriction that duplicate elements are prohibited.
- Set is **still** an interface. There are 3 implementations of Set in Java.
  - HashSet
  - TreeSet
  - LinkedHashSet



## Hash?



- No, Cheech. A hash table is a data structure in which we can “look up” (or search) for an element efficiently.
- The expected time to search for an element in a has table in  $O(1)$ . (Worst case time in  $\Theta(n)$ ).
- Think of a hash table as an array
- With a regular array, we find the element whose “key” is  $j$  in position  $j$  of the array. `j = 17; val = a[j];`
- This is called *direct addressing* and it takes  $O(1)$  on your regular ol’ random access computer.
- This form of direct addressing works when we can afford to have an array with one position for every possible key



## More on Hash



- In a hash table the number of keys stored is small relative to the number of possible keys
- A hash table is an array. Given a key  $k$ , we don’t use  $k$  as the index into the array – rather, we have a **hash function**  $h$ , and we use  $h(k)$  as an index into the array.
- Given a “universe” of keys  $K$ .
  - Think of  $K$  as all the words in a dictionary, for example
- $h : K \rightarrow \{0, 1, \dots, m - 1\}$ , so that  $h(k)$  gets mapped to an integer between 0 and  $m - 1$  for every  $k \in K$
- We say that  $k$  **hashes** to  $h(k)$



## Example

- This look great. However, what happens if  $h(k_1) = h(k_2)$  for  $k_1 \neq k_2$ ?
- Two keys hash to the same value. The element **collide**
- This is typically handled by **chaining**
- Instead of storing a key  $k$  (or later key value pair  $(k, v)$ ) at every position in the array, we store a linked **list** of keys.



## A (Fairly) Obvious point

- **BAD** hash function.  $h(k) = 3$ .
- If all keys hash to the same value, then looking up a key takes  $\Theta(n)$ . (Since it is just a list).
- We would like a hash function to be “random” in the sense that a key  $k$  is equally likely to has into any of the  $m$  slots in the hash table (array).
- If have have such a function, then we can show that the time required to search for a key is  $\Theta(1 + \frac{n}{m})$
- When hashing keys that are not numbers, you must convert them to numbers.

$$\text{BEER} = -142 + 2^4 + 5^3 + 5^2 + 18^1 = 42.$$



## Back to the Java Collections

- So Now you know what a Java HashSet is.
- A `LinkedHashSet` is a `HashSet` that also keeps track of the order in which elements were inserted.
- (Think of laying a linked list on top of the Hash Table)
- A `TreeSet` stores its elements in a alertred-black tree.
- In order to understand **red-black** trees, we must know about binary search trees.
- Hash table is “good” at `INSERT()`, `SEARCH()`, `DELETE()`.  
But what if you also want to support (efficiently) `MINIMUM()`, `MAXIMUM()`



## Binary Search Tree

- A **binary search tree** is a data structrue that is conceptualized as a binary tree. (Have you read Appendix B-4 yet?)
- Each node in the tree contains:
  - key  $k$ . (Or maybe (key, value):  $(k, v)$ )
  - left  $l$ : Points to the left child
  - right  $r$ : Points to the right child
  - parent  $p$ : Points to the parent

### Binary Search Tree Property

If  $y$  is in the left subtree of  $x$ , then  $k(y) \leq k(x)$



## Binary Search Trees

- There are lots of binary trees that can satisfy this property.
- It is obvious that the number of binary tree on  $n$  nodes  $b_n$  is

$$b_n = \frac{1}{n+1} \binom{2n}{n} \quad b_n = \frac{4^n}{\sqrt{\pi n^{3/2}}} (1 + O(1/n))$$

- And not all of these (exponentially many) are created equal.
- In fact, we would like to keep our binary search trees “short”, because most of the operations we would like to support are a function of the height  $h$  of the tree.



## Short Is Beautiful



- SEARCH() takes  $O(h)$
- MINIMUM(), MAXIMUM() also take  $O(h)$
- Slightly less obvious is that INSERT(), DELETE() also take  $O(h)$
- Thus we would like to keep out binary search trees “short” ( $h$  is small).



## red-black Trees

- red-black trees are simply a way to keep binary search trees short. (Or balanced)
- Balanced here means that no path on the tree is more than twice as long as another path.
- An implication of this is that its maximum height is  $2 \lg(n+1)$
- SEARCH(), MINIMUM(), MAXIMUM(), all take  $O(\lg n)$
- It's implementation is complicated, so we won't cover it
- INSERT(): also runs in  $O(\lg(n))$
- DELETE(): runs in  $O(\lg(n))$ 
  - (but it is more complicated to maintain the “red-black” property)



## Next Time?

- More on data structures and Java collections
- The greatest lab ever

### Small News

Let's have a LITTLE quiz on 2/7

