CS 10: Problem solving via Object Oriented Programming

Prioritizing

Agenda



- 1. Priority queues
- 2. Heaps
- 3. Implementing a PriorityQueue with a Heap
- 4. Java's PriorityQueue implementation
- 5. Supplemental information

We can model airplanes landing as a queue

Airplanes queued to land



Each airplane assigned a priority to land in order of arrival

First in the traffic pattern is the first to land (FIFO)

Sometimes higher priority issues arise and we need a different order

Airplanes queued to land

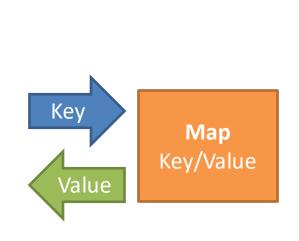


Suddenly one aircraft has an in-flight emergency and needs to land now!

Need a way to go to front of queue

Enter the priority queue

Priority Queues store/retrieve objects based on priority, not identity or arrival







5

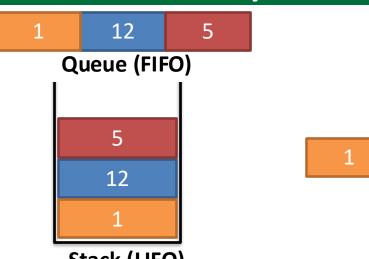
Priority Queue

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- Items stored/ retrieved by *priority*
- Priority does not represent identity as with a Map Key
- Not dependent on arrival order like Stack/Queue

Maps are a Key/Value store

- put(Key, Value) stores a Value associated with a Key (e.g., Key: Student ID and Value: Student Record)
- get(Key) return Value associated with Key
- Keys unique; identify object
- No ordering among Keys



Stacks/Queues arrival order

- Item order depends on when item arrived
- Only one item accessible at any time (top or front)

Priority Queues have the ability to extract the highest <u>priority</u> item

Priority Queue Overview

- Min: lowest priority number removed first ("number 1 for landing")
- Max: highest priority number removed first

Analogous methods for max priority queue

• Min Priority Queue ADT Operations

- insert (element) insert element into Priority Queue
 - Like BST, elements need a way to compare with each other to see which
 is the smallest, so element should implement compareTo()
 - We will say whatever compareTo() uses to compare elements is the <u>Key</u>
 - Many elements can have the same Key in a Priority Queue
- extractMin() remove and return element with smallest Key
- minimum() return element with smallest Key, but leaves the element in Priority Queue (like peek() or front() in Stack or Queue)
- is Empty() true if no items stored, false otherwise
- decreaseKey() reduces an element's priority number (take CS 31 for more details on this)

Priority Queues are extensively used in simulations and scheduling

Job scheduling example

Machine 1

Start job at time 0

Job takes 11 minutes

Add to Priority Queue that job will finish at time 11

Priority Queue

Key 11

0

9

Value

Machine 1 Machine 2 Machine 3

Machine 2

Start job at time 2
Job takes 6 minutes

Add to Priority Queue that job will finish at time 8

Which machine will finish first? When will that be? extractMin() to find out

Machine 3

Start job at time 4
Job takes 5 minutes

Add to Priority Queue that job will finish at time 9

No need to run simulation and check each minute to see if any machine finishes at times 0 through 7; can jump to time 8

Which machine will finish next? extractMin() again and get time 9

MinPriorityQueue.java specifies interface

As with BST, elements

must extend Comparable

MinPriorityQueue.java

```
Allows Java to compare
 6 public interface MinPriorityQueue<E extends Comparable<E>> {
 7⊝
                                                                         elements and determine
        * Is the priority queue empty?
        * @return true if the priority queue is empty, false if not empty. Which one is smaller
 9
        */
10
                                                                         Uses compareTo()
       public boolean isEmpty();
11
                                                                         method on element
12
       /**
13⊜
                                                                         objects
14
        * Insert an element into the queue.
                                                                         Can make a Max Priority
15
        * @param element thing to insert
16
                                                                         Queue by reversing the
17
       public void insert(E element);
                                                                         compareTo() method
18
       /**
19⊜
        * Return the element with the minimum key, without removing it from the queue.
20
21
        * @return the element with the minimum key in the priority queue
22
                                                                         Note: no ability to get
23
       public E minimum();
                                                                         items by index!
24
25⊜
       /**
26
        * Return the element with the minimum key, and remove it from the queue.
        * @return the element with the minimum key in the priority queue
27
28
                                                                         Can only extract smallest
29
       public E extractMin();
                                                                         (or largest) item
30 }
```

Unsorted List

15	6	9	27
----	---	---	----

Operation Run time

isEmpty

insert

minimum

extractMin

Unsorted List

15	6 9	27
----	-----	----

Operation	Run time	Notes
isEmpty	O(1)	Check size == 0
insert	O(1)	Add on to end (amortized growth)
minimum	Θ(n)	Must loop through all elements to find smallest
extractMin	Θ(n)	Loop through all elements and move last item to fill hole

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Unsorted List Sorted List 15 6 9 27 27 15 9 6

Operation	Unsorted	Sorted	Notes
isEmpty	O(1)		
insert	O(1)		
minimum	Θ(n)		
extractMin	Θ(n)		

Unsorted List

15 6 9 27

Sorted List

27 15 9 6

Operation	Unsorted	Sorted	Notes
isEmpty	O(1)	O(1)	Check size == 0
insert	O(1)	O(2n+1) = O(n)	Insert in order, move
minimum	Θ(n)	O(1)	Return last element
extractMin	Θ(n)	O(1)	Remove last element

Unsorted	l List		Sorted List					
15	6	9	27		27	15	9	6

Operation	Unsorted	Sorted	Notes
isEmpty	O(1)	O(1)	Check size == 0
insert	O(1)	O(n)	Insert in order, move
minimum	Θ(n)	O(1)	Return last element
extractMin	Θ(n)	O(1)	Remove last element

Agenda

1. Priority queues

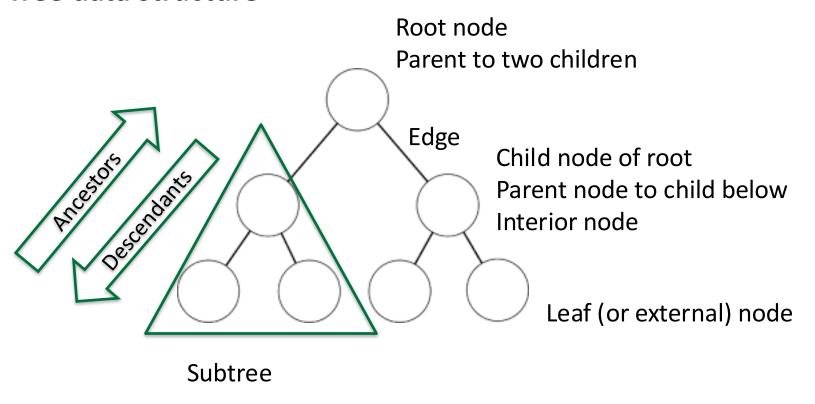


2. Heaps

- 3. Implementing a PriorityQueue with a Heap
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Heaps are conceptually based on Binary Trees

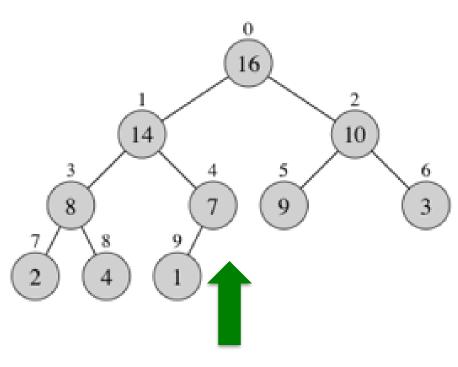
Tree data structure



In a Binary Tree, each node has 0, 1, or 2 children
Height is the number of edges on the longest path from root to leaf
No guarantee of balance in Tree, could have Vine

Heaps have two additional properties beyond Binary Trees: Shape and Order

Shape property keeps tree compact



Next node added here

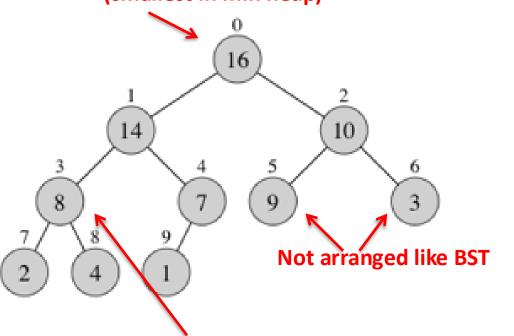
Shape property

- Nodes added starting from root and building downward
- Nodes added left to right
- New level started only once a prior level is filled
- Called a "complete" tree
- Prevents "vines"
- Makes height as small as possible: h = |log₂ n|

Heaps have two additional properties beyond Binary Trees: Shape and Order

Order property keeps nodes organized

Root is largest in max heap (smallest in min heap)



Subtree root is largest in subtree

Order property

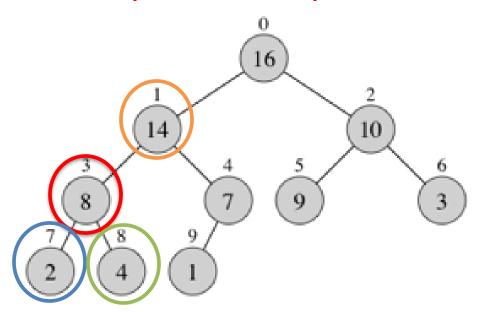
Reverse inequality for min heap

- ∀nodes i ≠ root, value(parent(i)) ≥ value(i)
- Root is the largest value in a max heap (or min value in a min heap)
- Largest value at any subtree is at the root of the subtree
 - Unlike BST, no relationship between two sibling nodes, other than they are less than parent

The shape property makes an array a natural implementation choice

Array implementation

Heap is conceptually a tree, data actually stored in an array



Nodes stored in array

- Node i stored at index i
- Parent at index (i-1)/2
- Left child at index i*2 +1
- Right child at index i*2+2

Node 3 containing 8

- *i*=3 Drop any decimal component
- Parent = (3-1)/2= 1
- Left child = 3*2+1 = 7
- Right child = 3*2+2=8

Agenda

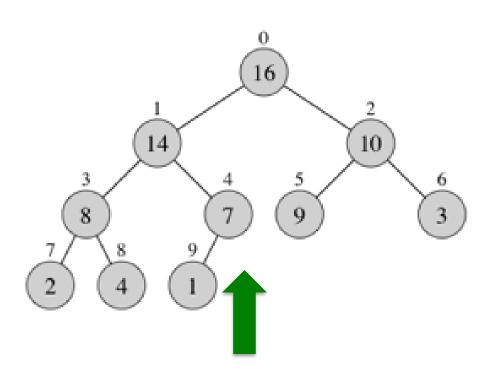
- 1. Priority queues
- 2. Heaps



- 3. Implementing a PriorityQueue with a Heap
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Inserting into max heap must keep both shape and order properties intact

Max heap insert



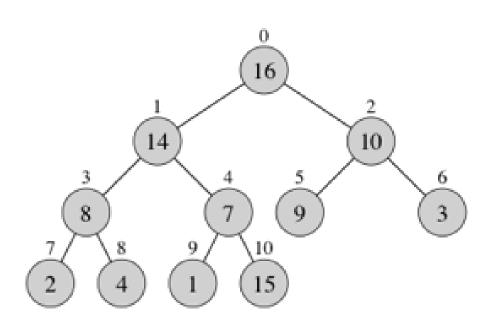
Next node added here

Insert 15

 Shape property: fill in next spot in left to right order (index i=10)

Inserting into max heap must keep both shape and order properties intact

Max heap insert



Insert 15

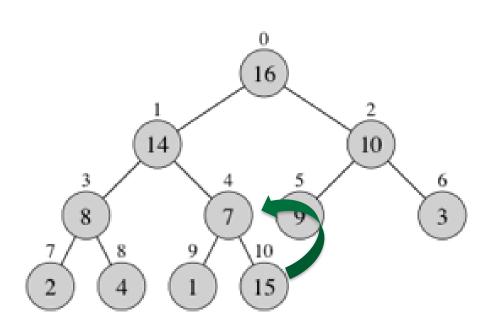
 Shape property: fill in next spot in left to right order (index i=10)



- Order property: parent must be larger than children
- Can't keep 15 below 7
- Swap parent and child

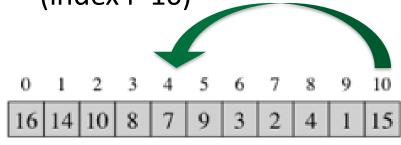
Inserting into max heap must keep both shape and order properties intact

Max heap insert



Insert 15

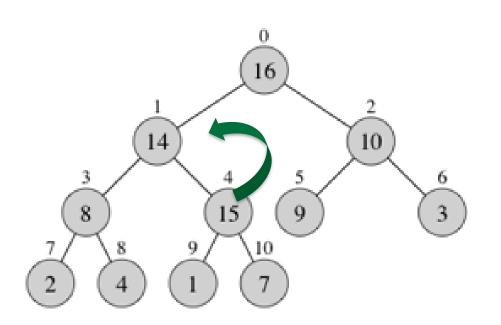
 Shape property: fill in next spot in left to right order (index i=10)



- Order property: parent must be larger than children
- Can't keep 15 below 7
- Swap parent and child
- Parent is at index (i-1)/2 = 4

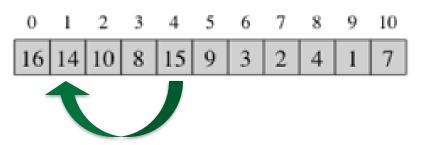
We may have to swap multiple times to get both heap properties

Max heap insert



Insert 15

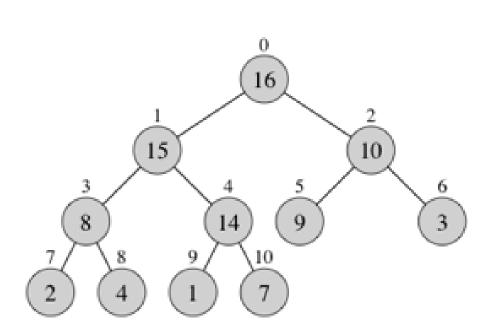
- Shape property: good!
- Order property: parent must be larger than children, not met



- Swap parent and child
- Child is at index *i=4*
- Parent at (i-1)/2=1

Eventually we will find a spot for the newly inserted item, even if that spot is the root

Max heap insert



Insert summary:

- Add new node at bottom left of tree
- Bubble new node up (possibly to root) until order restored
- Tree will be as compact as possible
- Largest (smallest) node at root

Insert 15

- Shape property: good!
- Order property: good!
- Done

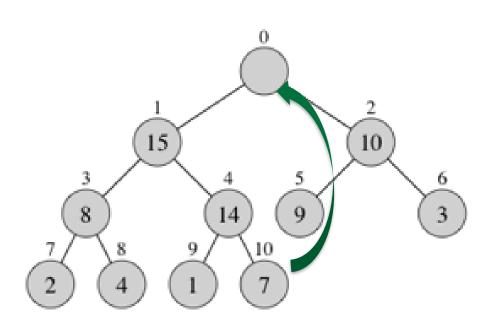


General rule

- Keep swapping until order property holds again
- Here done after swapping 14 and 15

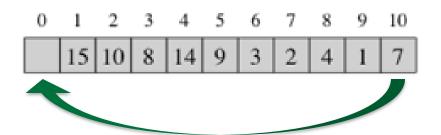
extractMax means removing the root, but that leaves a hole

extractMax



extractMax -> 16

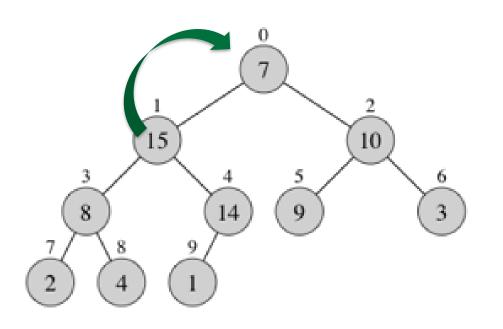
- Max position is at root (index 0)
- Removing it leaves a hole, violating shape property



- Also, bottom right most node must be removed to maintain shape property
- Solution: move bottom right node to root (like unsorted)

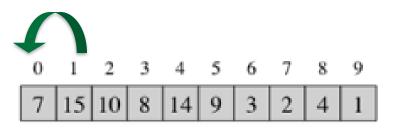
Moving bottom right node to root restores shape, but not order property

extractMax



After swap

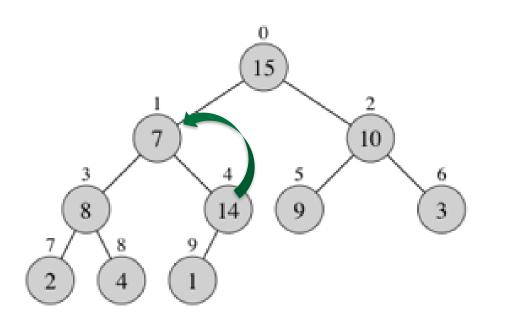
- Shape property: good!
- Order property: want max at root, but do not have that



- Left and right subtrees are still valid
- Swap root with larger child
- New root will be greater than everything in each subtree

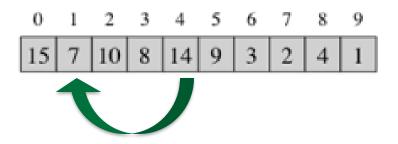
May need multiple swaps to restore order property

extractMax



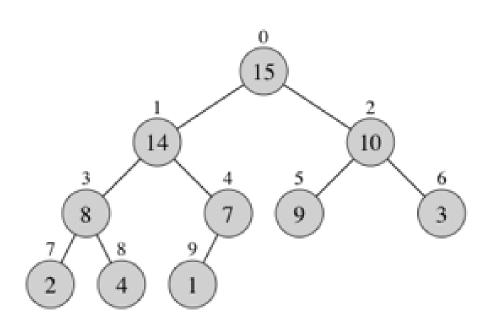
After swap 15 and 7

- Shape property: good!
- Order property: invalid
- Swap node with largest child



Stop once order property is restored

extractMax



After swap 7 and 14

- Shape property: good!
- Order property: good!

extractMax summary:

- Remove root
- Move last node to root
- Bubble new root down by repeatedly swapping with largest child until order is restored

Can implement heap-based Min Priority Queue using an ArrayList

HeapMinPriorityQueue.java

```
Heap elements extend
                                                     Comparable
  public class HeapMinPriorityQueue<E extends Comparable<E>>
   implements MinPriorityOueue<E> {
       private ArrayList<E> heap;
11
12
                                                  ArrayList called heap will hold the
13⊜
       /**
                                                  heap
14
           Constructor
15
16⊜
       public HeapMinPriorityOueue() {
           heap = new ArrayList<E>();
17
18
       }
19
```

NOTE: example was for a MAX Priority Queue, this code implements a MIN Priority Queue

Easy to change to this code to a MAX Priority Queue (see slide 32)

Helper functions make finding parent and children easy

```
HeapMinPriorityQueue.java
                                            Helper functions
                                            swap() trades node at index i for node at index j
エッ・
108
         // Swap two locations i and j in ArrayList a.
         private static <E> void swap(ArrayList<E> a, int i, int j) {
109⊖
110
             E temp = a.get(i); //temporarily hold item at index i
             a.set(i, a.get(j)); //set item at index i to item at index j
111
             a.set(j, temp); //set item at index j to temp
112
         }
113
114
115
         // Return the index of the left child of node i.
116⊖
         private static int leftChild(int i) {
117
             return 2*i + 1;
                                                  leftChild(), rightChild() and parent()
118
                                                  calculate positions of nodes relative to i
119
         // Return the index of the right child of node i.
120
         private static int rightChild(int i) {
121⊖
122
             return 2*i + 2;
123
         }
124
         // Return the index of the parent of node i
125
         // (Parent of root will be -1)
126
         private static int parent(int i) {
127⊝
128
             return (i-1)/2;
129
                                                                                       30
```

120

insert() adds a new item to the end and swaps with parent if needed

HeapMinPriorityQueue.java

- Add element to end of heap
- Start at newly added item's index

```
public void insert(E element)
41⊜
           heap.add(element);
42
                                       // Put new value at end:
           int loc = heap.size()-1;
                                       // and get its location
43
44
45
           // Swap with parent until parent not larger
           while (loc > 0 && heap.get(loc).compareTo(heap.get(parent(loc))) < 0) {</pre>
46
                swap(heap, loc, parent(loc));
47
                loc = parent(loc);
48
49
       }
50
```

insert() adds a new item to the end and repeatedly swaps with parent if needed

HeapMinPriorityQueue.java

```
index
                                                               NOTE: reverse compareTo
       public void insert(E element)
                                                               inequality to implement a
41⊜
                                      // Put new value at end; MAX Priority Queue
           heap.add(element);
42
           int loc = heap.size()-1;
                                      // and get its location
43
45
           // Swap with parent until parent not larger
           while (loc > 0 && heap.get(loc).compareTo(heap.get(parent(loc))) < 0) {</pre>
46
               swap(heap, loc, parent(loc));
47
               loc = parent(loc);
48
49
                                             Swap if not root (loc==0) and element < parent
50
       }
                                             Continue to "bubble up" inserted node until
```

Add element to end of heap

Start at newly added item's

reach root or element > parent

way up to root)

 $O(\log_2 n)$

At most *O(h)* swaps (if new node goes all the

Due to Shape Property, max h is $log_2 n$, so

extractMin() gets the root at index 0, moves last to root, and "re-heapifies"

HeapMinPriorityQueue.java

```
Always at the root (index 0)
24⊜
       public E extractMin() {
                                                           Move last item into root node to
           if (heap.size() <= 0)
25
               return null;
26
                                                           satisfy Shape Property
           else {
27
               E minVal = heap.get(0); //min will be at node 0
28
               heap.set(0, heap.get(heap.size()-1)); // Move last to position 0
29
               heap.remove(heap.size()-1); //remove last item to maintain shape prope
30
               minHeapify(heap, 0); //recursively swap to maintain order property
31
               return minVal; Kreturn min value
32
33
       }
```

Property

Where will smallest element be?

Update heap so that it satisfies Order

May have to "bubble down" the new

At most $O(h) = O(\log_2 n)$ operations

root down to leaf level

minHeapify() recursively enforces Shape and Order Properties

HeapMinPriorityQueue.java

```
a = heap, i = starting index
79⊜
       private static <E extends Comparable <E>>> void
       minHeapify(ArrayList<E> a, int i) \( \)
80
           int left = leftChild(i); // index of node i's left child
81
                                                                                Get left and right children
           int right = rightChild(i); // index of node i's right child
82
                          // will hold the index of the node with the smallest eleme
83
                                                                                       indices
84
           // among node i, left, and right
85
86
           // Is there a left child and, if so, does the left child have an
                                                                                 Find the smallest node
87
           // element smaller than node i?
                                                                                 between the current
88
           if (left \leq a.size()-1 && a.get(left).compareTo(a.get(i)) \leq 0)
               smallest = left; // yes, so the left child is the largest so far
89
                                                                                 node, and the (possibly)
90
           else
                                                                                 two children
91
               smallest = i;
                                  // no, so node i is the smallest so far
92
                                                                                 Track smallest index in
93
           // Is there a right child and, if so, does the right child have an
                                                                                 smallest variable
94
           // element smaller than the larger of node i and the left child?
95
           if (right <= a.size()-1 && a.get(right).compareTo(a.get(smallest)) < 0)</pre>
96
               smallest = right; // yes, so the right child is the largest
97
                                                                                       If starting index is
98
           // If node i holds an element smaller than both the left and right
                                                                                       not the smallest,
99
           // children, then the min-heap property already held, and we need do
           // nothing more. Otherwise, we need to swap node i with the larger
100
                                                                                       then swap node at
101
           // of the two children, and then recurse down the heap from the larger chil
                                                                                       starting index with
102
           if (smallest != i) {
               swap(a, i, smallest); //put smallest in spot i, largest in spot smalles
103
                                                                                       smallest node
               minHeapify(a, smallest); //maintain heap starting from smallest index (
104
                                                                                       Bubble down node
105
                            At most O(h) = O(\log_2 n) operations
106
                                                                                       from smallest index
```

Run time analysis shows Priority Queue heap implementation better than previous

Operation	Неар	Unsorted List	Sorted List
isEmpty	O(1)	O(1)	O(1)

isEmpty()

Each implement just checks size of ArrayList; O(1)

Run time analysis shows Priority Queue heap implementation better than previous

Operation	Неар	Unsorted List	Sorted List
isEmpty	O(1)	O(1)	O(1)
insert	O(log ₂ n)	O(1)	O(n)

insert()

- Heap: insert at end O(1), then may have to bubble up height of tree; O(log₂ n)
- Unsorted ArrayList: just add on end of ArrayList; O(1)
- Sorted ArrayList: have to find place to insert O(n), then do
 insert, moving all other items; O(n)

Run time analysis shows Priority Queue heap implementation better than previous

		Unsorted	Sorted
Operation	Heap	List	List
isEmpty	O(1)	O(1)	O(1)
insert	O(log ₂ n)	O(1)	O(n)
minimum	O(1)	Θ(n)	O(1)

minimum()

- Heap: return item at index 0 in ArrayList; O(1)
- Unsorted ArrayList: search Arraylist; Θ(n)
- **Sorted ArrayList:** return last item in ArrayList; O(1)

Run time analysis shows Priority Queue heap implementation better than previous

	Неар	Unsorted List	Sorted List
Operation			
isEmpty	O(1)	O(1)	O(1)
insert	O(log ₂ n)	O(1)	O(n)
minimum	O(1)	Θ(n)	O(1)
extractMin	O(log ₂ n)	Θ (n)	O(1)

extractMin()

- Heap: return item at index 0, then replace with last item,
 then bubble down height of tree; O(log₂ n)
- Unsorted ArrayList: search Arraylist, Θ(n), remove, then fill hole with last item; O(n)
- Sorted ArrayList: return last item in ArrayList; O(1)

Run time analysis shows Priority Queue heap implementation better than previous

		Unsorted	Sorted
Operation	Heap	List	List
isEmpty	O(1)	O(1)	O(1)
insert	O(log ₂ n)	O(1)	O(n)
minimum	O(1)	Θ(n)	O(1)
extractMin	O(log ₂ n)	Θ(n)	O(1)

With Unsorted ArrayList or Sorted ArrayList, can't escape paying O(n) (either insert or extractMin)

Heap must pay $O(log_2 n)$, but that is much better than O(n) when n is large

Remember $O(log_2 n)$ where n = 1 million is 20 (one billion is 30)

Agenda

- 1. Priority queues
- 2. Heaps
- 3. Implementing a PriorityQueue with a Heap
- 4. Java's PriorityQueue implementation
- 5. Supplemental information

Java implements a *PriorityQueue*, but with non-standard names

Java's *PriorityQueue* Operations

- isEmpty == isEmpty
- insert == add
- minimum == peek
- extractMin == remove

Why remove() instead of extractMin()? We will control if the min or max gets removed (next slides show how)

If we use our own Objects in *PriorityQueue*, need to provide way to compare objects

Student.java

Three ways to compare objects in Java's Priority Queue:



- Method 1: Objects stored in Priority Queue provide a compareTo() method
- Method 2: Instantiate a custom Comparator and pass to Priority Queue constructor
- Method 3: Use anonymous function in Priority Queue declaration

Use Student object to demonstrate the three Priority Queue methods

```
public class SimpleStudent implements Comparable<SimpleStudent> {
  private String name;
                              Stores data about a
  private int year;
                              student's name and year
  public SimpleStudent(String name, int year) {
   this.name = name;
   this.year = year;
  * Comparable: just use String's version (lexicographic)
  @Override
  public int compareTo(SimpleStudent s2) {
   return name.compareTo(s2.name);
  @Override
  public String toString() {
   return name + " "+year;
```

Class implements
Comparable so
PriorityQueue holding
SimpleStudent objects
can compare students
If we are going to use SimpleStudent in a
PriorityQueue, need a way to tell which
ones are bigger, the same, or smaller than
other Students

Here we use the built in String compareTo() method to evaluate SimpleStudents based on name (could reverse compareTo() for descending order)

- If this name < s2.name return negative
- If this name equals s2.name return 0
- If this *name > s2.name* return positive

This approach sorts increasing alphabetically by student name

Method 1: Objects in Priority Queue provide *compareTo()* method

```
public static void main(String[] args) {
 //create List of students and add some
  List<SimpleStudent> students = new ArrayList<SimpleStudent>();
  students.add(new SimpleStudent("charlie", 18));
  students.add(new SimpleStudent("alice", 20));
  students.add(new SimpleStudent("bob", 19));
  students.add(new SimpleStudent("elvis", 21));
  students.add(new SimpleStudent("denise", 20));
  System.out.println("original:" + students);
  // Three methods for using Comparator
 // Method 1:
 // Create Java PriorityQueue and use Student
  // class's compareTo method (lexicographic order)
  // this is used if comparator not passed to PriorityQueue constructor
  PriorityQueue<SimpleStudent> pg = new PriorityQueue<SimpleStudent>();
  pg.addAll(students); //add all Students in ArrayList in one statement
  //remove until empty (this essentially sorting!)
  System.out.println("\nlexicographic:");
  while (!pg.isEmpty()) System.out.println(pg.remove());
```

SimpleStudent.java

- SimpleStudent Objects added to ArrayList in undefined order
- Objects have name and year instance variables
 - Priority Queue created to hold SimpleStudent Objects
 - No Comparator provided in constructor
 - By default PriorityQueue will use SimpleStudent object's compareTo() to find min Key
 ArrayList of students is added to PriorityQueue with addAll()
- Output in sorted order

method

removes smallest SimpleStudent
object using compareTo()

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Method 1: Objects in Priority Queue provide *compareTo()* method

SimpleStudent.java

```
public static void main(String[] args) {
 //create List of students and add some
  List<SimpleStudent> students = new ArrayList<SimpleStudent>();
  students.add(new SimpleStudent("charlie", 18));
  students.add(new SimpleStudent("alice", 20));
                                                               Output in alphabetical order
  students.add(new SimpleStudent("bob", 19));
                                                               original: [charlie '18, alice '20, bob '19, elvis '21, denise '20]
  students.add(new SimpleStudent("elvis", 21));
  students.add(new SimpleStudent("denise", 20));
                                                               lexicographic:
  System.out.println("original:" + students);
                                                               alice '20
                                                               bob '19
  // Three methods for using Comparator
                                                               charlie '18
                                                               denise '20
 // Method 1:
                                                               elvis '21
 // Create Java PriorityQueue and use Student
 // class's compareTo method (lexicographic order)
 // this is used if comparator not passed to PriorityQueue constructor
  PriorityQueue<SimpleStudent> pq = new PriorityQueue<SimpleStudent>();
  pg.addAll(students); //add all Students in ArrayList in one statement
  //remove until empty (this essentially sorting!)
  System.out.println("\nlexicographic:");
  while (!pg.isEmpty()) System.out.println(pg.remove());
```

If we use our own PriorityQueue, we need to provide way to compare objects

Student.java

Three ways to compare objects in Java's Priority Queue:

 Method 1: Objects stored in PriorityQueue provide a compareTo() method



- Method 2: Instantiate a custom Comparator and pass to Priority Queue constructor
- Method 3: Use anonymous function in Priority Queue declaration

Method 2: Define custom Compator and pass to Priority Queue constructor

What if Object has compareTo() but you want a different order?

SimpleStudent.java

```
// Method 2:
// Use a custom Comparator.compare (length of name) instead
// of using the element's compareTo function
// Java will use this to compare two Students (here on length of name)
class NameLengthComparator implements Comparator<SimpleStudent> {
   public int compare(SimpleStudent s1, SimpleStudent s2) {
     return s1.name.length() - s2.name.length();
   }
}
```

- Still in main()
- Method 2: define Comparator class that requires compare() method
- compare() has two Student params
 Here we use length of name to
 compare two Student Objects
- compare() returns negative, equal,
 or positive same as compareTo()

```
Comparator<SimpleStudent> lenCompare = new NameLengthComparator();
pq = new PriorityQueue<SimpleStudent>(lenCompare); //passing Comparator to PriorityQueue
pq.addAll(students); //add all students to PriorityQueue
System.out.println("\nlength:");
//remove until empty (sorting)
while (!pq.isEmpty()) System.out.println(pq.remove());
```

Method 2: Define custom Compator and pass to Priority Queue constructor

What if Object has compareTo() but you want a different order?

pq = new PriorityQueue<SimpleStudent>(lenCompare); Npassing Comparator to PriorityQueue

SimpleStudent.java

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Comparator<SimpleStudent> lenCompare = new NameLengthComparator();

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while (!pq.isEmpty()) System.out.println(pq.remove());

System.out.println("\nlength:");

//remove until empty (sorting)

Still in main()

- Define Comparator class that requires compare() method
- compare() has two Student params
 Here we use length of name to
 compare two Student Objects
- compare() returns negative, equal,
 or positive same as compareTo()

Instantiate new Comparator

- Create new Priority Queue and pass Comparator in constructor
- Then fill Priority Queue with students
- Sort by looping until Priority Queue empty
- Each time remove *Student* with smallest Key as determined by Comparator <u>instead</u> of Student's compareTo()

Method 2: Define custom Compator and pass to Priority Queue constructor

SimpleStudent.java

```
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Comparator<SimpleStudent> lenCompare = new NameLengthComparator();
pg = new PriorityQueue<SimpleStudent>(lenCompare); //passing Comparator to PriorityQueue
pg.addAll(students); //add all students to PriorityQueue
System.out.println("\nlength:");
//remove until empty (sorting)
                                                                  Output based on name length
while (!pq.isEmpty()) System.out.println(pq.remove());
                                                                        length:
                                                                        bob '19
                                                                        elvis '21
                                                                        alice '20
                                                                        denise '20
                                                                        charlie '18
```

If we use our own PriorityQueue, we need to provide way to compare objects

Student.java

Three ways to compare objects in Java's Priority Queue:

- Method 1: Objects stored in Priority Queue provide a compareTo() method
- Method 2: Instantiate a custom Comparator and pass to Priority Queue constructor



Method 3: Use anonymous function in Priority Queue declaration

Method 3: Use anonymous function in Priority Queue declaration

SimpleStudent.java

```
//Method 3:
// Use a custom Comparator via Java 8 anonymous function (here based on year)
// pass Comparator to PriorityQueue constructor
pq = new PriorityQueue<SimpleStudent>((SimpleStudent s1, SimpleStudent s2) -> s2.year - s1.year);
pq.addAll(students); //add all students to Priority Queue
System.out.println("\nyear:");
//remove until empty (sorting)
while (!pq.isEmpty()) System.out.println(pq.remove());
```

- Anonymous functions don't have a name
- Declared "inline"
- Sometimes called "lambda function"
- Here compare Students based on year
- Passed to Priority Queue constructor
- Students removed by anonymous function order (year in this case), not compareTo() order

Method 3: Use anonymous function in Priority Queue declaration

SimpleStudent.java

```
//Method 3:
// Use a custom Comparator via Java 8 anonymous function (here based on year)
// pass Comparator to PriorityQueue constructor
pq = new PriorityQueue<SimpleStudent>((SimpleStudent s1, SimpleStudent s2) -> s2.year - s1.year);
pq.addAll(students); //add all students to Priority Queue
System.out.println("\nyear:");
//remove until empty (sorting)
while (!pq.isEmpty()) System.out.println(pq.remove());
```

Output based on year in descending order (reversed order of compared objects)

```
year:
elvis '21
denise '20
alice '20
bob '19
charlie '18
```

Created a <u>Max</u> Priority Queue by simply reversing compare

Agenda

- 1. Priority queues
- 2. Heaps
- 3. Implementing a PriorityQueue with a Heap
- 4. Java's PriorityQueue implementation

5. Supplemental information

Supplemental material



1. Reading from a file

2. Heapsort

Use a BufferedReader to read a file line by line until reaching the end of file

Roster.java

```
BufferedReader input = new BufferedReader(new FileReader(fileName));
String line;
int lineNum = 0;
while ((line = input.readLine()) != null) {
   System.out.println("read @"+lineNum+"`"+line+"'");
   lineNum++;
}
```

- BufferedReader opens file with name filename
- Reading will start at beginning of file
- Each line from file stored in line in while loop
- input.readLine will return null at end of file
- Here we are just printing each line

Roster.java

117

```
public static List<Student> readRoster2(String fileName) throws IOException {
 77
            List<Student> roster = new ArrayList<Student>();
 78
            BufferedReader input;
 79
 80
            // Open the file, if possible
 81
            try {
 82
                 input = new BufferedReader(new FileReader(fileName));
 83
 84
            catch (FileNotFoundException e) {
 85
                System. err. println("Cannot open file. \n" + e.getMessage());
 86
                return roster;
 87
 88
            // Read the file
 89
 90
            try {
                // Line by line
 91
 92
                String line;
 93
                int lineNum = 0;
                while ((line = input.readLine()) != null) {
 94
 95
                     System.out.println("read @"+lineNum+"`"+line+"'");
 96
                     // Comma separated
 97
                     String[] pieces = line.split(",");
                     if (pieces.length != 2) {
 98
 99
                         //did not get two elements in this line, output an error message
                         System. err. println("bad separation in line "+lineNum+":"+line);
100
                     }
101
102
                    else {
103
                         // got two elements for this line
104
                         try {
105
                             // Extract year as an integer, if possible
                             Student s = new Student(pieces[0], Integer.parseInt(pieces[1]));
106
                             System.out.println("=>"+s);
107
108
                             roster.add(s); //good student, add to roster
109
110
                         catch (NumberFormatException e) {
111
                             // couldn't parse second element as integer
                             System.err.println("bad number in line "+lineNum+":"+line);
112
113
                         }
114
115
                     lineNum++;
116
```

- Many possible exceptions reading data from a file:
 - File may not be found
 - Some data might be missing (e.g., name without a year)
 - Some data might be invalid (e.g., year is not a valid Integer)

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```

- This method reads a comma separated variable (csv) file
- Each line should have student name and year
- Creates a Student Object from each line of the file
- Returns a List of Student
 Objects with one entry for each
 valid line
 - File name to read is passed as String parameter

Roster.java

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                                Catch error if file not found
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```

- This method reads a comma separated variable (csv) file
- Each line should have student name and year
- Creates a Student Object from each line of the file
- Returns a List of Student
 Objects with one entry for each valid line
 - File name to read is passed as String parameter
 - Read each line of file, store in *line* String
 Split() on comma, make sure we got two parts (input could be invalid)

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```

- Got two elements after
 split()
- Try to parse as name as String and year as Integer
- Add to *roster* if valid student

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```

- Got two elements after split()
- Try to parse as name as String and year as Integer
- Add to roster if valid student

- If second element not Integer:
 - Catch error
 - Print error message
 - Keep reading

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112
113
                        }
114
                                     Close file in finally block (not
115
                    lineNum++;
116
                                     shown) – always runs
```

- Got two elements after split()
- Try to parse as name as String and *year* as Integer
- Add to roster if valid student

- If second element not Integer:
 - Catch error
 - Print error message
 - **Keep reading**

Supplemental material

1. Reading from a file



2. Heapsort

Using a heap, we can sort items "in place" in a two-stage process

Heap sort

Given array in unknown order

- 1. Build max heap in place using array given
 - Start with last non-leaf node, max heapify node and children
 - Move to next to last non-leaf node, max heapify again
 - Repeat until at root
 - NOTE: heap is not necessarily sorted, only know for sure that parent > children and max is at root
- 2. Extract max (index 0) and swap with item at end of array, then rebuild heap not considering last item

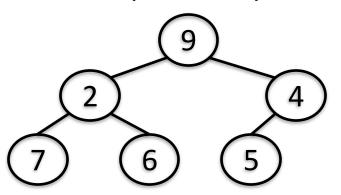
Does not require additional memory to sort

Build heap given unsorted array

Array



Conceptual heap tree



Given array in unsorted order First build a heap in place

- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

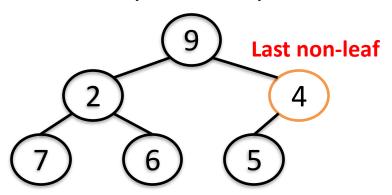
Non heap!

Build heap given unsorted array

Array



Conceptual heap tree



Given array in unsorted order First build a heap in place

- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

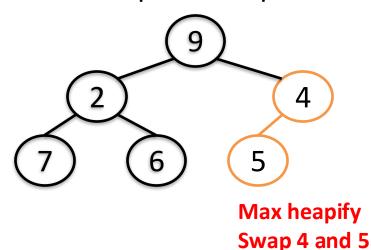
Last non-leaf will be parent of last leaf

Build heap given unsorted array

Array



Conceptual heap tree



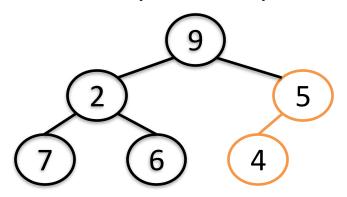
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Build heap given unsorted array

Array

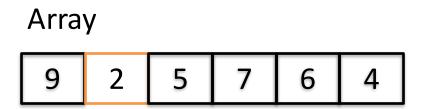


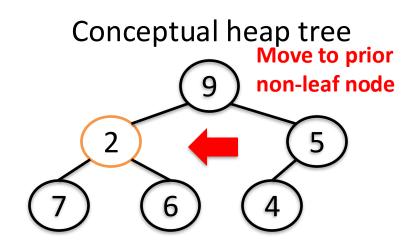
Conceptual heap tree



- Start at last non-leaf and heapify
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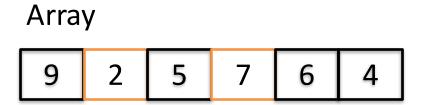
Build heap given unsorted array

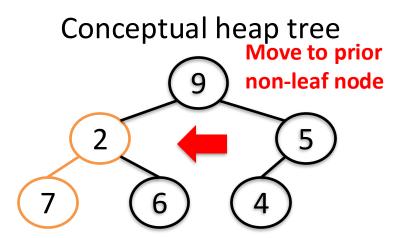




- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

Build heap given unsorted array





Max heapify Swap 2 and 7

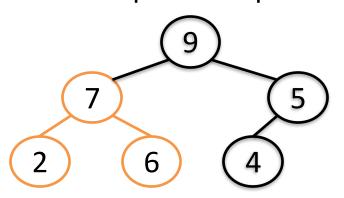
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Build heap given unsorted array

Array



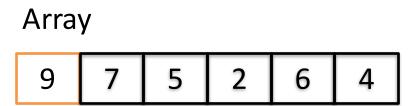
Conceptual heap tree

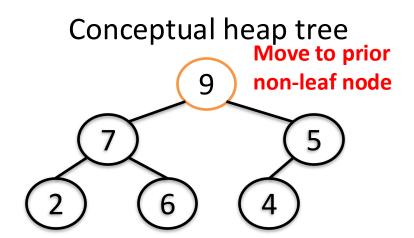


Max heapify Swap 2 and 7

- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

Build heap given unsorted array





- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

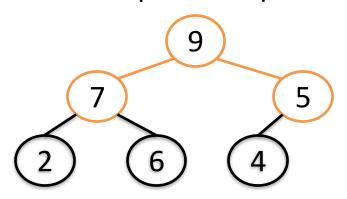
Step 1: build heap in place

Build heap given unsorted array

Array



Conceptual heap tree



Max heapify
In order, no need to swap

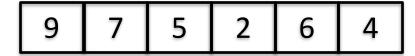
Given array in unsorted order First build a heap in place

- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

Step 1: build heap in place

Build heap given unsorted array

Array



7 5

Conceptual heap tree

Given array in unsorted order First build a heap in place

- Start at last non-leaf and heapify
- Repeat for other non-leaf nodes

Now it's a max heap!
Satisfies Shape and Order
Properties

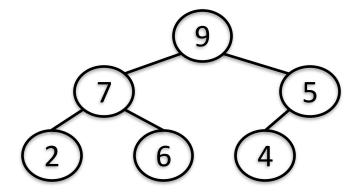
After building the heap, parents are larger than children, but items may not be sorted





Heap array after construction

Conceptual heap tree

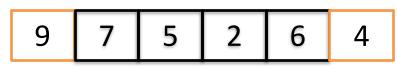


Heap order is maintained here Looping over array does not give elements in sorted order Traversing tree doesn't work either

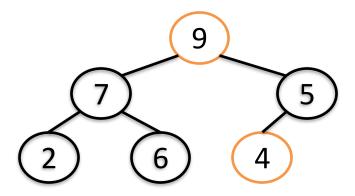
- Preorder = 9,7,2,6,5,4
- Inorder = 2,7,6,9,4,5
- Post order = 2,6,7,4,5,9

Heap on left, sorted on right

Array



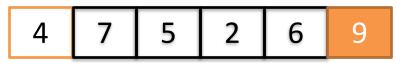
Conceptual heap tree



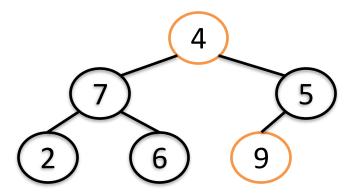
extractMax() = 9
Swap with last item in array

Heap on left, sorted on right

Array

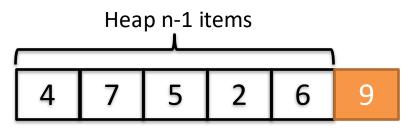


Conceptual heap tree

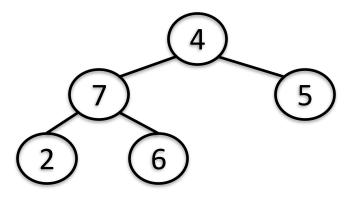


extractMax() = 9
Swap with last item in array

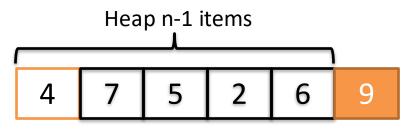
Heap on left, sorted on right



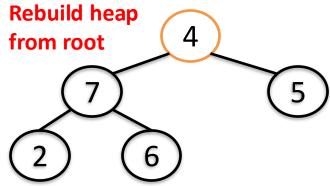
Conceptual heap tree



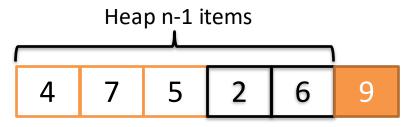
Heap on left, sorted on right



Conceptual heap tree

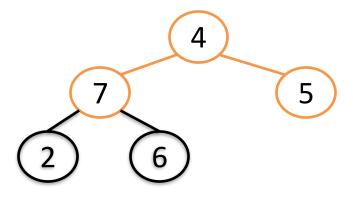


Heap on left, sorted on right



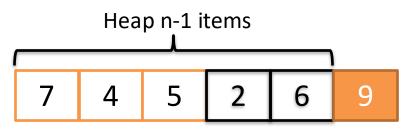
Swap 4 with largest child 7

Conceptual heap tree

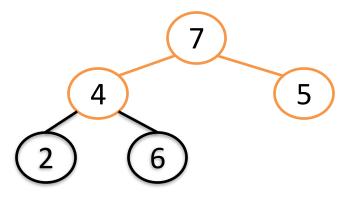


Max heapify Swap 7 and 4

Heap on left, sorted on right

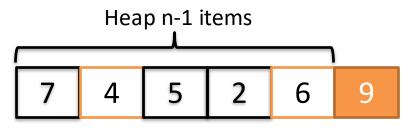


Conceptual heap tree



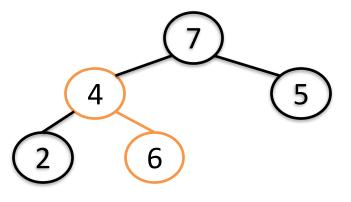
Max heapify Swap 7 and 4

Heap on left, sorted on right



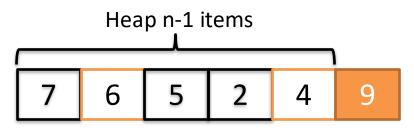
Swap 4 with largest child 6

Conceptual heap tree

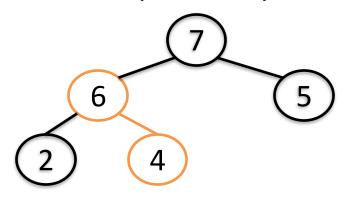


Max heapify Swap 4 and 6

Heap on left, sorted on right

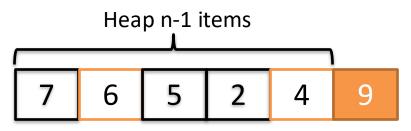


Conceptual heap tree

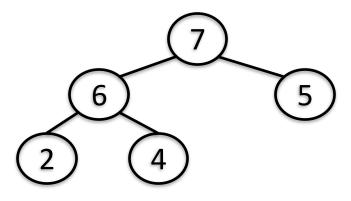


Max heapify Swap 4 and 6

Heap on left, sorted on right

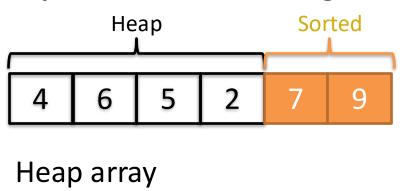


Conceptual heap tree

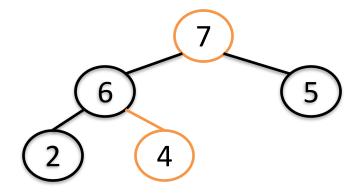


Heap built

Heap on left, sorted on right

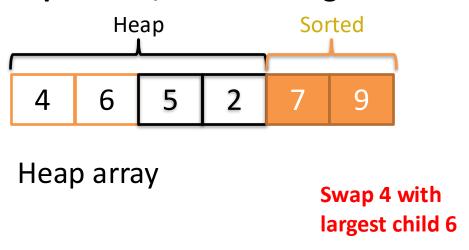


Conceptual heap tree

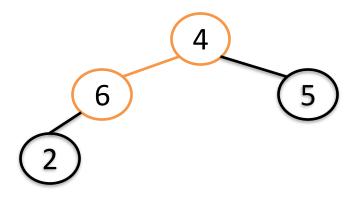


extractMax() = 7
Swap with last item in array

Heap on left, sorted on right

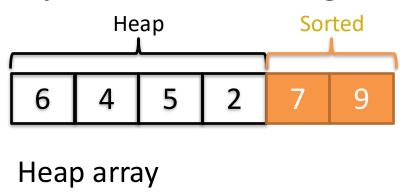


Conceptual heap tree

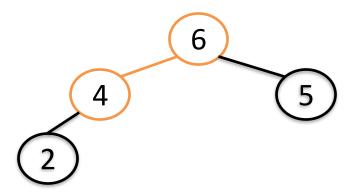


Max heapify Swap 4 and 6

Heap on left, sorted on right

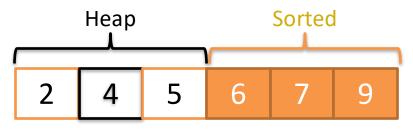


Conceptual heap tree



Heap built

Heap on left, sorted on right

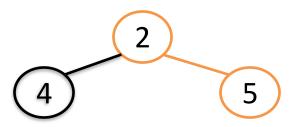


Heap array

Swap 2 with largest child 5

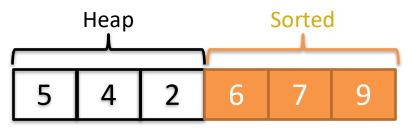
extractMax() = 6
Swap with last item in array

Conceptual heap tree



Max heapify Swap 5 and 2

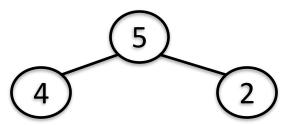
Heap on left, sorted on right



Heap array

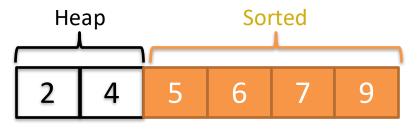
Rebuild heap on n-3 items

Conceptual heap tree



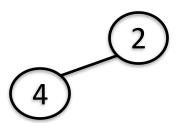
Heap built

Heap on left, sorted on right



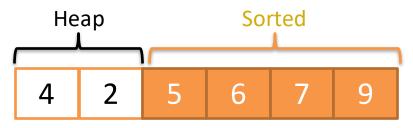
Heap array

Conceptual heap tree



extractMax() = 5
Swap with last item in array

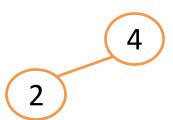
Heap on left, sorted on right



Heap array

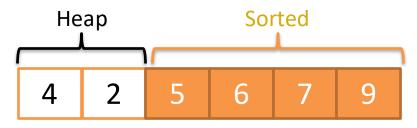
Rebuild heap on n-4 items

Conceptual heap tree



Max heapify Swap 4 and 2

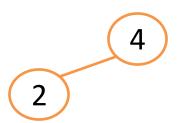
Heap on left, sorted on right



Heap array

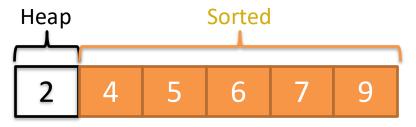
Rebuild heap on n-4 items

Conceptual heap tree



Heap built

Heap on left, sorted on right



Heap array

extractMax() = 4
Swap with last item in array

Conceptual heap tree

2

Heap on left, sorted on right



Heap array

Done
Items sorted in place
No extra memory used

Conceptual heap tree

Heapsort.java: First build heap, then extractMin, rebuild heap...

```
Code very similar to
 9 public class Heapsort<E extends Comparable<E>>> {
                                                                  HeapMinPriorityQueue.java
       //no constructor! instead we sort arrays in place
10
11
       /**
12⊖
13
        * Sort the array a[0..n-1] *inplace* using the heapsort algorithm.
                                                            Sort() method calls helper with
14
15⊜
       public void sort(E[] a, int n) {
                                                            size of heap to consider
16
           heapsort(a, n - 1);
                                                            Initially consider each element
17
       }
18
19⊜
       /**
20
        * Sort the array a[0..lastLeaf] by the heapsort algorithm.
21
                                                                       First build heap from root to
220
       private void heapsort(E□ a, int lastLeaf) {
           // First, turn the array a[0..lastleaf] into a max-heap.last element to be considered
23
           buildMaxHeap(a, lastLeaf);
                                                                        (initially last element, then n-2,
24
25
           // Once the array is a max-heap, repeatedly swap the root then n-3,...)
26
           // with the last leaf, putting the largest remaining element value \frac{1}{2} with the last leaf's position, declare this last leaf to \frac{1}{2} to \frac{1}{2} while not at root, (lastLeaf > 0)
27
28
29
           // longer be in the heap, and then fix up the heap.
                                                                           Swap root and last element
           while (lastLeaf > 0) {
30
31
                swap(a, 0, lastLeaf);
                                              // swap the root with the last leaf
32
                lastLeaf--;
                                              // the last leaf is no longer in the heap
               maxHeapify(a, 0, lastLeaf); // fix up what's left
33
                                                                           Reduce size of heap to consider
34
                                                                           Rebuild smaller heap
35
       }
                                                                           Done when at root
```

Heapsort.java: First build heap, then extractMin, rebuild heap...

```
42⊖
       private void maxHeapify(E[] a, int i, int lastLeaf) {
           int left = leftChild(i);
43
                                        // index of node i's left child
           int right = rightChild(i);
44
                                       // index of node i's right chel
                                         // will hold the index of the n
45
           int largest;
46
           // Is there a left child and, if o, does the left child have
47
           if (left <= lastLeaf && a[left].compareTo(a[i]) > 0)
48
               largest = left; // yes, so the left child is the largest
49
50
           else
               largest = i;
                               // no, so node i is the largest so far
51
52
53
           // Is there a right child and, if so, does the right child ha
54
           // element larger than the larger of node i and the left chil
55
           if (right <= lastLeaf && a[right].compareTo(a[largest]) > 0)
               largest = right; // yes, so the right child is the larges
56
57
58
            * If node i holds an element larger than both the left and r
59
            * children, then the max-heap property already held, and we
60
            * nothing more. Otherwise, we need to swap node i with the l
61
            * of the two children, and then recurse down the heap from t
            * child.
            */
64
           if (largest != i) {
65
               swap(a, i, largest);
66
67
               maxHeapify(a, largest, lastLeaf);
68
69
      }
70
71⊖
72
       * Form array a[0..lastLeaf] into a max-heap.
73
      private void buildMaxHeap(E□ a, int lastLeaf) {
74⊖
75
           int lastNonLeaf = (lastLeaf - 1) / 2; // nodes lastNonLeaf+1
           for (int j = lastNonLeaf; j >= 0; j--)
76
               maxHeapify(a, j, lastLeaf);
```

Finds largest between *i* and two children

If *largest* not *i*, swap *i* and *largest*Recursively call *maxHeapify()* to bubble down *i* to right place

- buildHeap() builds heap from last non-leaf node (parent of last leaf)
- Calls maxHeapify() on each non-leaf node until hit root

Heapsort in two steps

Given array in unknown order

- 1. Build max heap in place using array given
 - Start with last non-leaf node, max heapify node and children
 - Move to next to last non-leaf node, max heapify again
 - Repeat until at root
 - NOTE: heap is not necessarily sorted, only know parent > children and max is at root
- 2. Extract max (index 0) and swap with item at end of array, then rebuild heap not considering last item

Does not require additional memory to sort

Run time:

Building heap is O(n) – see course web page (most nodes are leaves) Each extractMax/swap might need $O(log_2 n)$ operations to restore Heap Make n-1 = O(n) extractMax/swaps to get array in sorted order 97 Total run time is $O(n) + O(n \log_2 n) = O(n \log_2 n)$