

Priority Queues and Heaps

15-211
Fundamental Data Structures and Algorithms

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Based on lectures given by Peter Lee, Avrim Blum, Danny Sleator, William Scherlis,
Ananda Guna & Klaus Sulner

Definition of Priority Queue

Definition: An *abstract data type* to efficiently support finding the item with the highest priority across a series of operations. The basic operations are: insert, find-minimum (or maximum), and delete-minimum (or maximum).

Priority Queue

- P-queue is a data structure that allows:
 - Insertion and deleteMin in $O(\log n)$
 - $O(1)$ findMin operation
- **Applications**
 - Operating System Design – resource allocation
 - Data Compression - Huffman algorithm
 - Discrete Event simulation
 - 1) *Insertion* of time-tagged events (time represents a priority of an event -- low time means high priority)
 - 2) *Removal* of the event with the smallest time tag
- **Implementation**
 - Linked Lists
 - Using a binary Heap – a special binary tree with heap property

Priority queue Operations

- **new**
 - Create a new priority queue.
- **insertItem(x)**
 - Insert object x into the p-queue.
- **minElement()**
 - Return the minimum element from the p-queue.
- **removeMin()**
 - Return and remove the minimum element from the p-queue.

Some questions

- How do we ensure that there is a concept of a “minimum”?
- What should happen in **minElement()** and **removeMin()** if the priority queue is empty?
- How long does it take to perform operations like **insertItem(x)** and **removeMin()**?

Comparing Objects

Comparing objects

- In Java, objects can be compared for equality:

```
public void doSomething (Person x, Person y) {  
    ...  
    if (x == y) { ... }  
    ...  
}
```

What does it mean for two objects to be equal?

Comparing objects

- Note that this is an issue only for objects.
- Values of base type (such as int, float, char, etc.) have built-in comparison operations ==, <, <=, ...
- But javac can't possibly know how to compare objects.
 - E.g., Is a>b where a and b are objects

The *Comparable* interface

- Suppose we want to put objects of class `Person` into our priority queue.
- What we can do is require that every `Person` object has a method that computes whether it is bigger, smaller, or equal to another `Person` object.
- The JDK has a built-in interface just for this purpose, called `Comparable`.

The *Comparable* interface

```
public interface Comparable {  
    public int compareTo (Object obj);  
}
```

Returns <0 if object is less than obj,
=0 if object is equal to obj,
>0 if object is greater than obj.

The *Comparable* interface

```
public class Person implements Comparable {  
    ...  
}  
  
...  
    Person a = new Person("Klaus");  
    Person b = new Person("Peter");  
  
    if (a.compareTo(b)) { ... }  
    ...
```

A caution

- Note that the `compareTo()` method takes *any* object (not just `Person` objects, for example).

```
Gorilla a = new Gorilla ("Freddy");  
Person b = new Person ("Matt");  
  
if (a.compareTo(b)) { ... }  
...
```
- If a comparison makes no sense at all, then by convention the exception `ClassCastException` is raised.

Exceptional Conditions

Some questions

- How do we ensure that there is a concept of a “minimum”?
- What should happen in `minElement()` and `removeMin()` if the priority queue is empty?
- How long does it take to perform operations like `insertItem(x)` and `removeMin()`?

One possibility

- If `removeMin()` is applied to an empty priority queue, it could return `null`.
- **Pro:** Simple.
- **Con:** May require that all calls to `removeMin()` check for `null`.

An alternative

- A common approach is to raise an *exception*.

```
public class PriorityQueue {
    ...
    public int removeMin() throws
        PriorityQueueEmptyException {
        ...
        if (isEmpty())
            throw new PriorityQueueException(
                "Empty priority queue in removeMin()");
        ...
    }
}
```

Exception classes

```
public class PriorityQueueException
    extends Exception {

    public PriorityQueueException() {
        super();
    }

    public PriorityQueueException(String s) {
        super(s);
    }
}
```

More on this later...

Implementation p-queue

Using Binary Trees

- We expect the *find* and *insert* operations to take $O(\log N)$ time.
- In fact, operations like *find* take time d , where d is the depth of the item in the tree.
- Since the depth is not expected to be larger than $\log(N)$, and each step down the tree requires constant time, we get $O(\log N)$. More later..

Analysis of BSTs

- If all insertion sequences are equally likely (that is, the insertion order is random), then on average a binary search tree has depth $O(\log_2(N))$.
- Define $D(N)$ to be the sum of the depths of all nodes in a tree with N nodes.
 - $D(1) = 0$.

Analysis, cont'd

- For a tree with $N > 1$ nodes:
 - i nodes in left subtree,
 - $N-i-1$ nodes in the right subtree,
 - and one node at root. (for $0 \leq i < N$)

Analysis, cont'd

- So,
 - $D(N) = D(i) + D(N-i-1) + N - 1$
- The average value of $D(i)$ and $D(N-i-1)$ is

$$\sum_{j=0}^N D(j)/N$$
- So, $D(N) = 2(\sum_{j=0}^N D(j))/N + N - 1$

Analysis, cont'd

- There are methods for solving such *recurrence equations*.
- We shall see later that this equation has the solution $O(N \log N)$.
- Thus, on average the depth of any particular node is $O(\log N)$.

Priority queue implementation

- **Linked list**

➤ removeMin $O(1)$	}	or	{	$O(N)$
➤ insertItem $O(N)$				$O(1)$
- **Heaps**

	<i>avg</i>	<i>worst</i>
➤ deleteMin	$O(\log N)$	$O(\log N)$
➤ insert	2.6	$O(\log N)$
<small>special case:</small>		
➤ build	$O(N)$	$O(N)$
<small>i.e., insert*N</small>		

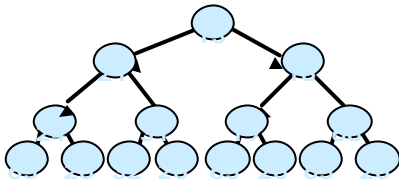
Heaps

- A binary tree.
- Representation invariant
 1. Structure property
 - Complete binary tree
 2. Heap order property
 - Parent keys less than children keys

Heaps

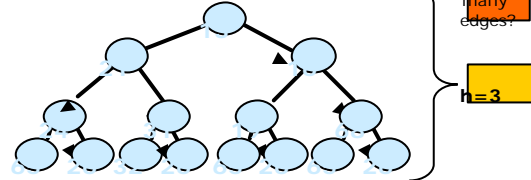
- Representation invariant
 1. Structure property
 - Complete binary tree
 - Hence: efficient compact representation
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 - Parent keys less than children keys
 - Hence: rapid insert, findMin, and deleteMin
 - $O(\log(N))$ for insert and deleteMin
 - $O(1)$ for findMin

Perfect binary trees



Perfect binary trees

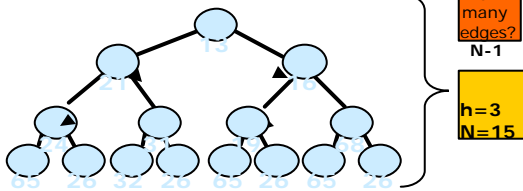
- How many nodes?
 - $N = 2^4 - 1 = 15$
 - In general: $N = \sum_{0 \leq i < h} 2^i = 2^{h+1} - 1$
 - Most of the nodes are leaves



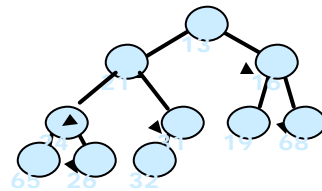
Perfect binary trees

- What is the sum of the heights?

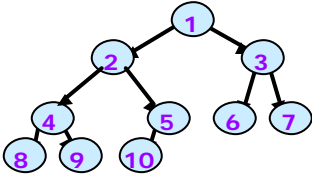
$$S = \sum_{0 \leq i < h} 2^i(h-i) = O(N) \quad \leftarrow \text{prove this}$$



Complete binary trees

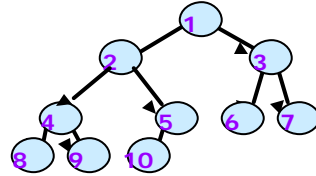


Complete binary trees



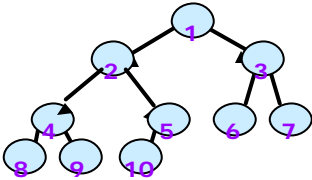
Representing complete binary trees

- Linked structures? *No!*
- Arrays!



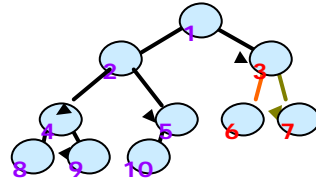
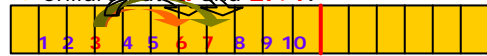
Representing complete binary trees

- Arrays
 - Parent at position i
 - Children at $2i$ and $2i+1$.



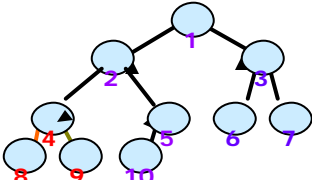
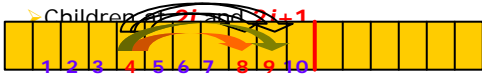
Representing complete binary trees

- Arrays (1-based)
 - Parent at position i
 - Children at $2i$ and $2i+1$.



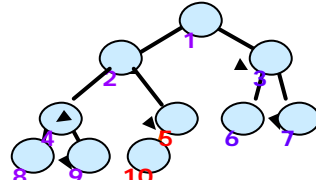
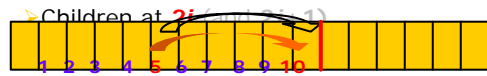
Representing complete binary trees

- Arrays (1-based)
 - Parent at position i
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Representing complete binary trees

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Representing complete binary trees

- Arrays (1-based)
 - Parent at position i
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```
public class BinaryHeap {
    private Comparable[] heap;
    private int size;
    public BinaryHeap(int capacity) {
        size=0;
        heap = new Comparable[capacity+1];
    }
    . . .
}
```

Representing complete binary trees

- Arrays
 - Parent at position i
 - Children at $2i$ and $2i+1$.
- Example: find the leftmost child


```
int left=1;
for(; left<size; left*=2);
return heap[left/2];
```
- Example: find the rightmost child

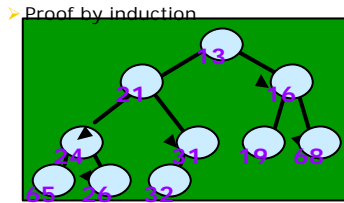

```
int right=1;
for(; right<size; right=right*2+1);
return heap[(right-1)/2];
```

Heaps

- Representation invariant
 - Structure property
 - Complete binary tree
 - Hence: efficient compact representation
 - Heap order property
 - Parent keys less than children keys
 - Hence: rapid insert, findMin, and deleteMin
 - $O(\log(N))$ for insert and deleteMin
 - $O(1)$ for findMin

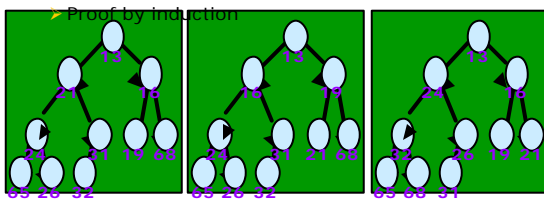
The heap order property

- Each parent is less than each of its children.
- Hence: Root is less than every other node.



The heap order property

- Each parent is less than each of its children.
- Hence: Root is less than every other node.



Operating with heaps

Representation invariant:

- All methods **must**:
 - Produce complete binary trees
 - Guarantee the heap order property
- All methods **may assume**
 - The tree is initially complete binary
 - The heap order property holds

findMin ()

- The code

```
public boolean isEmpty() {  
    return size == 0;  
}  
public Comparable findMin() {  
    if(isEmpty()) return null;  
    return heap[1];  
}
```

- Does not change the tree
 - Trivially preserves the invariant

insert (Comparable x)

- Process

1. Create a "hole" at the next tree cell for **x**.
`heap[size+1]`
This preserves the completeness of the tree.

2. *Percolate* the hole *up* the tree until the heap order property is satisfied.
This assures the heap order property is satisfied.

insert (Comparable x)

- Process

1. Create a "hole" at the next tree cell for **x**.
`heap[size+1]`

This preserves the **completeness** of the tree
assuming it was complete to begin with.

2. *Percolate* the hole *up* the tree until the heap order property is satisfied.

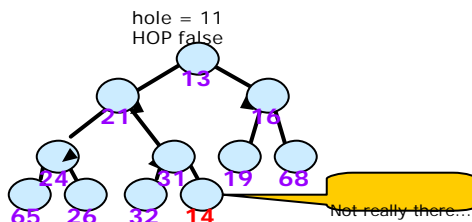
This assures the **heap order property** is satisfied
assuming it held at the outset.

Percolation up

```
public void insert(Comparable x)  
    throws Overflow  
{  
    if(isFull()) throw new Overflow();  
    int hole = ++size;  
    for(;;  
        hole>1 && x.compareTo(heap[hole/2])<0;  
        hole/=2)  
        heap[hole] = heap[hole/2];  
    heap[hole] = x;  
}
```

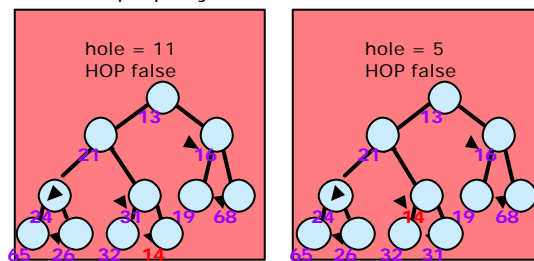
Percolation up

- Bubble the hole **up the tree** until the heap order property is satisfied.



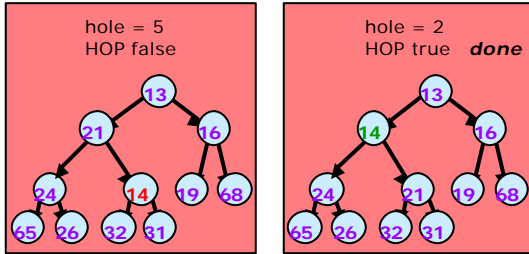
Percolation up

- Bubble the hole **up the tree** until the heap order property is satisfied.



Percolation up

- Bubble the hole up the tree until the heap order property is satisfied.



deleteMin()

```

/**
 * Remove the smallest item from the priority queue.
 * @return the smallest item, or null, if empty.
 */
public Comparable deleteMin( )
{
    if(isEmpty()) return null;
    Comparable min = heap[1];
    heap[1] = heap[size--];
    percolateDown(1);
    return min;
}

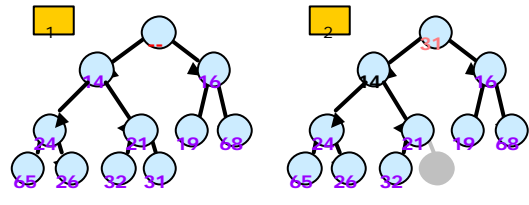
```

Grab min element

Temporarily place last element at top !!!

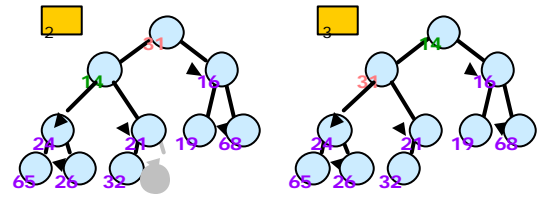
Percolation down

- Bubble the transplanted leaf value **down the tree** until the heap order property is satisfied.



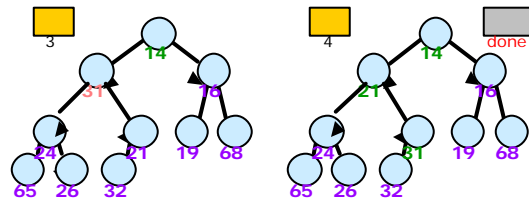
Percolation down

- Bubble the transplanted leaf value **down the tree** until the heap order property is satisfied.



Percolation down

- Bubble the transplanted leaf value **down the tree** until the heap order property is satisfied.



deleteMin ()

- Observe that both components of the **representation invariant** are preserved by **deleteMin**.

1. Completeness

.

.

2. Heap order property

deleteMin ()

- Observe that both components of the **representation invariant** are preserved by `deleteMin`.
 - Completeness
 - The **last cell** (`heap[size]`) is **vacated**, providing the value to percolate down.
 - This assures that the tree remains complete.
 - Heap order property

deleteMin ()

- Observe that both components of the **representation invariant** are preserved by `deleteMin`.
 - Completeness
 - The **last cell** (`heap[size]`) is **vacated**, providing the value to percolate down.
 - This assures that the tree remains complete.
 - Heap order property
 - The percolation algorithm assures that the orphaned value is **relocated to a suitable position**.

buildHeap

- Equivalent to a sequence of inserts

```
for(int i=0;i<N;i++)
  insert(input[i]);
```
- Two steps:
 - Fill the array (in no particular order).
 - percolateDown, bottom up.

```
for(int i=size/2; i>0; i--)
  percolateDown(i);
```

 - This does a linear number of comparisons

Thursday

- We will talk about Greedy Algorithms
- Read Chapter 7
- HW3 is online now
 - > You must read homework assignment before recitation tomorrow**
- Start Early
- Ask Questions Early
- Go to Recitation Tomorrow