

CSCI 136:  
Data Structures  
and  
Advanced Programming

Lecture 31

Heaps

Instructor: Kelly Shaw

**Williams**

Topics

Connectedness

Priority Queues

Heaps

Your to-dos

1. Read **before Wed**: Review readings from *Bailey*.
2. Lab 10 (partner lab), **due Tuesday 5/10 by 10pm**.
3. **Last quiz**, this **Fri/Sat**.

Announcements

1. **Student course surveys**,  
in lab, **Wednesday & Thursday this week**.
2. **Final exam**: Saturday, Dec 17, 1:30pm.  
Room TBD.
3. **Final exam review session**,  
in class, last day of class, **Friday 12/9**.

## Announcements



Sean Barker '09, Bowdoin College

Friday, Dec 2 @ 2:35pm

Computer Science Colloquium – Wege TCL 123

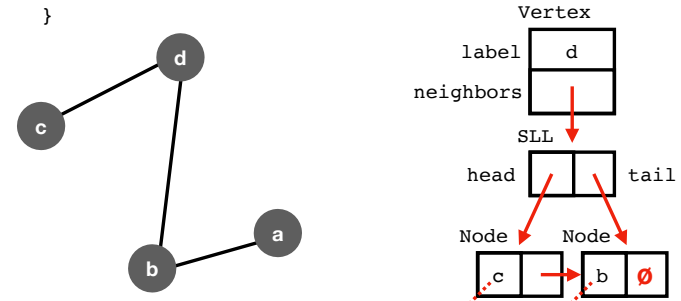
Smart Meters for Smart Cities: Data Analytics in Energy-Aware Buildings

The proliferation of smart energy meters has resulted in many opportunities for next-generation buildings. Energy-aware “smart buildings” may optimize their energy consumption and provide convenience and economic benefits through analysis of their meter data. However, storing and analyzing this data presents computational challenges, especially when conducted at scale. In this talk, I discuss our work on several problems in this space, focusing particularly on efficient compression of smart meter data and the disaggregation of building-wide consumption into individual device consumption. Our work in these areas aims to support the development of sustainable, energy-efficient smart cities and smart grids.

## But first, a clarification

### Object-oriented adjacency list:

```
public class Vertex<T> {  
    T label;  
    List<Vertex<T>> neighbors = new SinglyLinkedList<>();  
    ...  
}
```



(strictly speaking, c and d are references to Vertex objects)

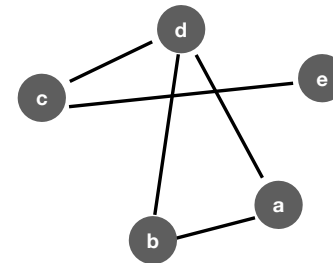
## Connectedness

## Activity: connectedness

`boolean isConnected()`

How might I compute this using fundamental ops?

(adjacent, vertices, incident, degree, neighbors)



(note that graph is undirected)

## Idea: breadth-first counting

Idea:

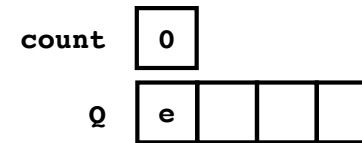
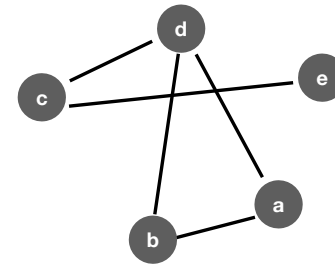
(suppose we know IGI)

`boolean isConnected(Vertex start)`

1. let `count = 0`
2. let `Q` be an empty queue
3. enqueue `start`
4. while `Q` not empty
  - a. dequeue `v`
  - b. count `v`
  - c. mark `v` as visited
  - d. put `v`'s unmarked neighbors in `Q`
5. if `count = # of vertices in graph`, return `true` else `false`

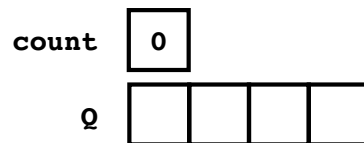
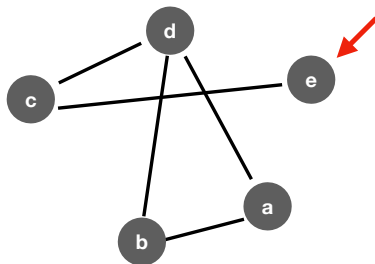
## Algorithm: connectedness

initialize algorithm



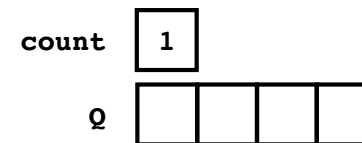
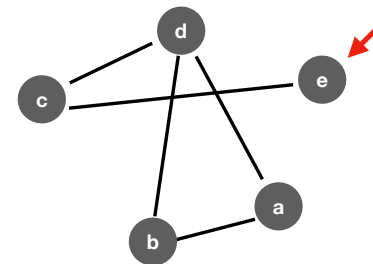
## Algorithm: connectedness

dequeue v



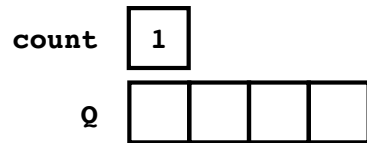
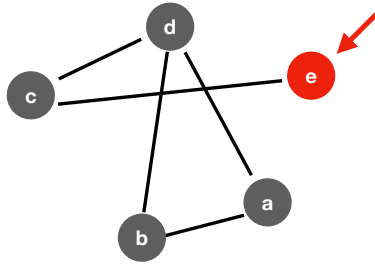
## Algorithm: connectedness

count v



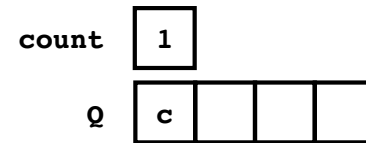
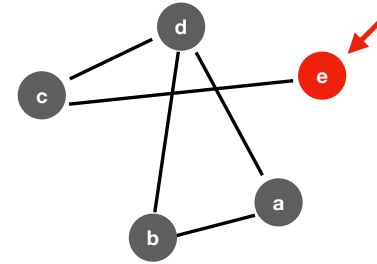
### Algorithm: connectedness

mark v



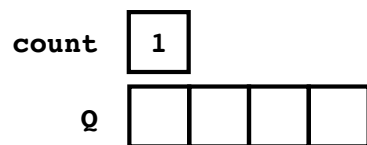
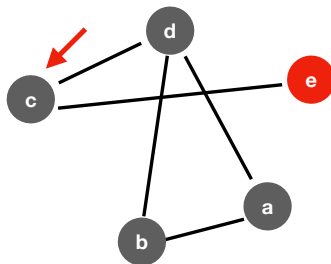
### Algorithm: connectedness

enqueue unmarked neighbors



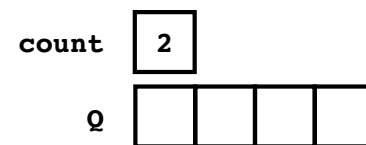
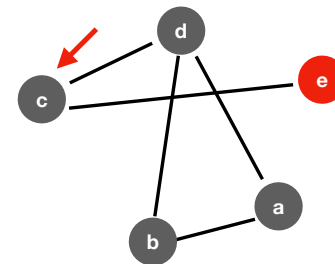
### Algorithm: connectedness

dequeue v



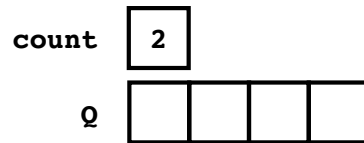
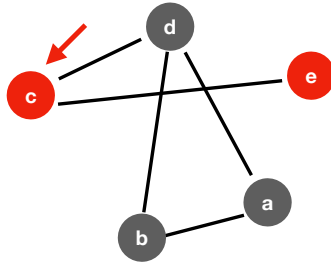
### Algorithm: connectedness

count v



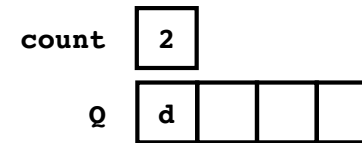
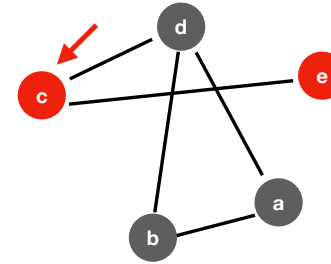
### Algorithm: connectedness

mark v



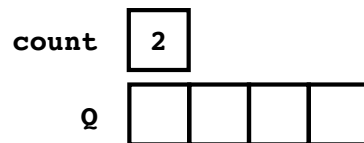
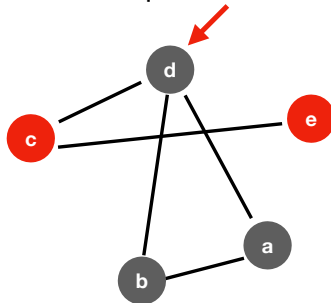
### Algorithm: connectedness

enqueue unmarked neighbors



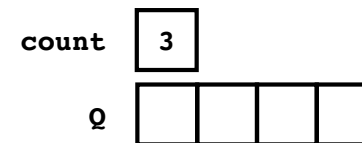
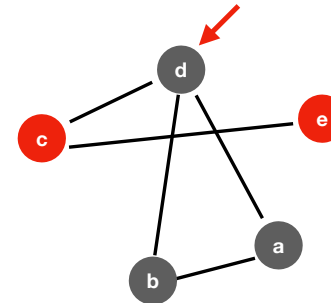
### Algorithm: connectedness

dequeue v

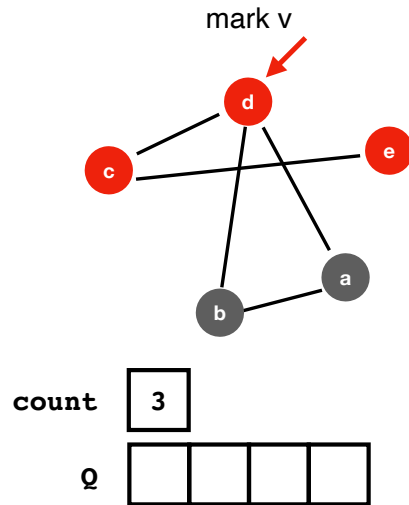


### Algorithm: connectedness

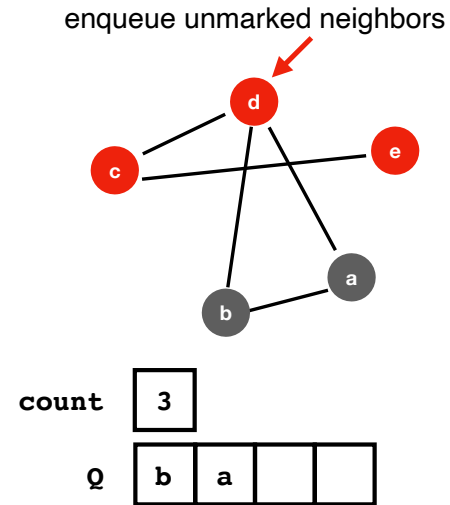
count v



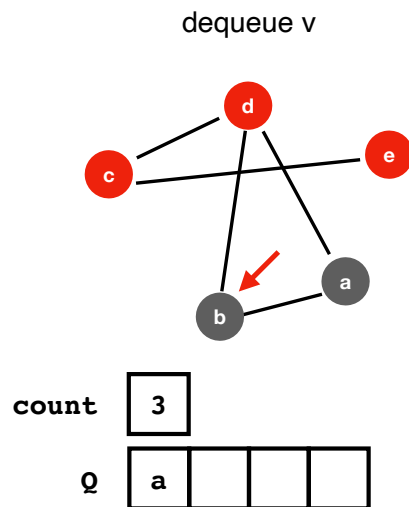
### Algorithm: connectedness



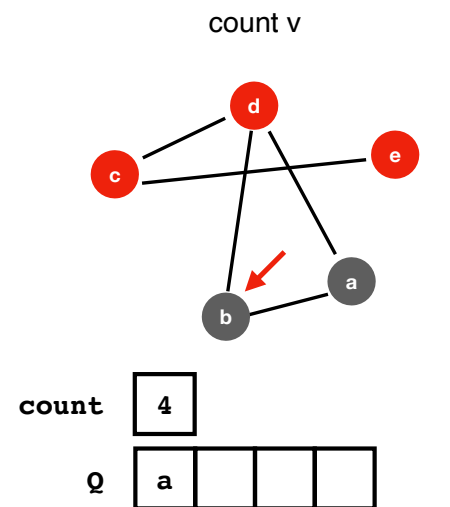
### Algorithm: connectedness



### Algorithm: connectedness

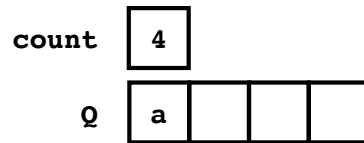
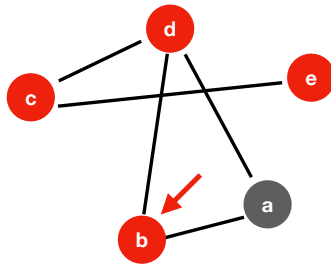


### Algorithm: connectedness



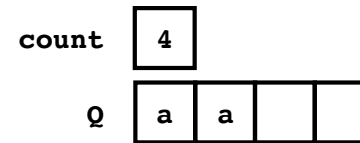
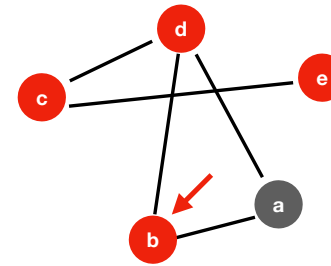
### Algorithm: connectedness

mark v



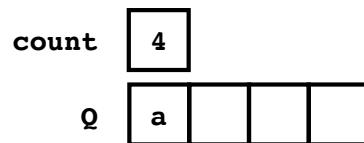
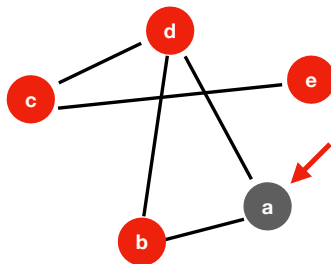
### Algorithm: connectedness

enqueue unmarked neighbors



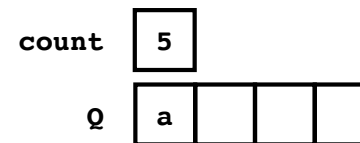
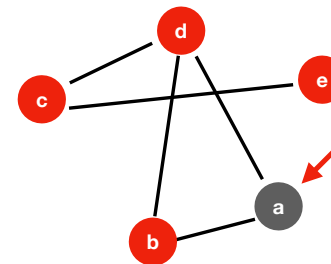
### Algorithm: connectedness

dequeue v



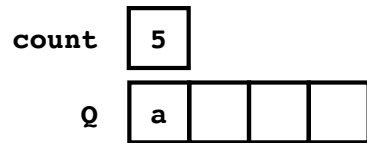
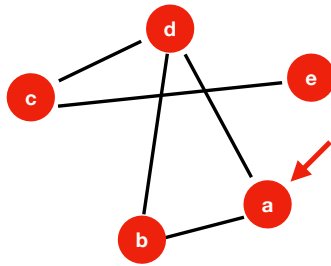
### Algorithm: connectedness

count v



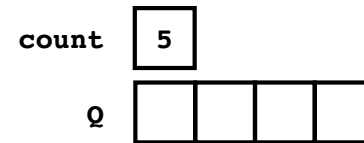
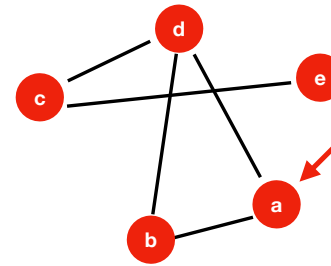
### Algorithm: connectedness

mark v



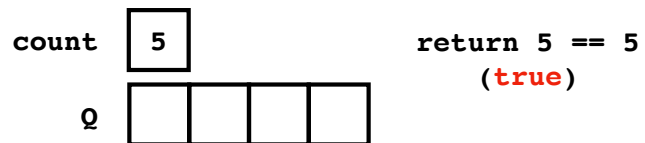
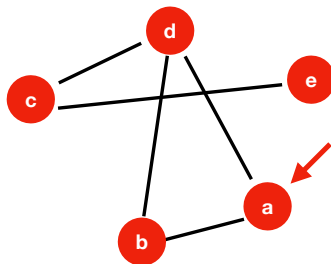
### Algorithm: connectedness

dequeue v (but don't visit)



### Algorithm: connectedness

compute  $|G| == \text{count}$



Priority Queues



## Priority Queue

A **priority queue** is an abstract data type that returns the elements in **priority order**. Under priority ordering, an element **e** with a higher priority (an integer) is returned before all elements **L** having lower priority, even if that **e** was enqueued after all **L**. When any two elements have **equal priority**, they are returned in **first-in, first-out order** (i.e., in the order in which they were enqueued).

## Note

I will refer here to the **maximum** priority. But you could also refer to **minimum** priority. All that matters is that you order your data with respect to some **extremum**.

## Priority Queue



0 1 2 3



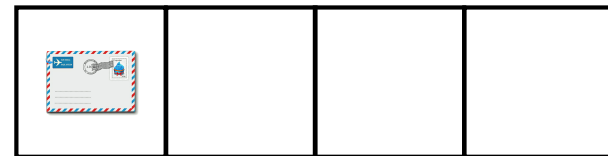
Ordinary letter



Blue letter

## Priority Queue

enqueue



0 1 2 3



Ordinary letter



Blue letter

# Priority Queue

enqueue



0

1

2

3



Ordinary letter



Blue letter

# Priority Queue

enqueue



0

1

2

3



Ordinary letter



Blue letter

# Priority Queue

extract



0

1

2

3



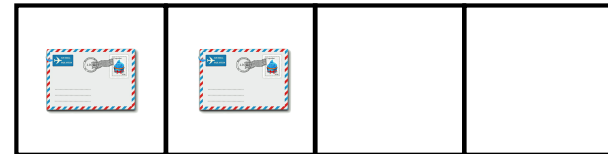
Ordinary letter



Blue letter

# Priority Queue

extract



0

1

2

3



Ordinary letter



Blue letter

## Priority Queue

extract



0

1

2

3



Ordinary letter



Blue letter

## Priority Queue

blue letters: enqueue



0

1

2

3



Ordinary letter



Blue letter

## Priority Queue

blue letters: extract



0

1

2

3



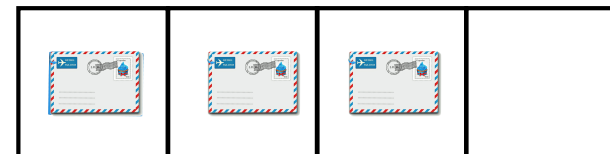
Ordinary letter



Blue letter

## Priority Queue: Operations

**insert:** inserts an element with a given priority value. Ensures that the next element of the queue is in priority order. Like **enqueue**.



0

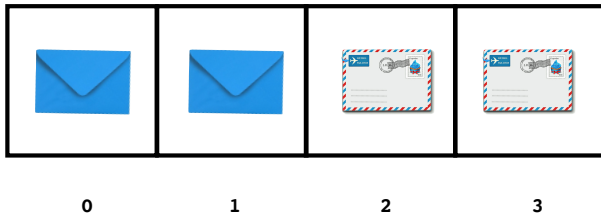
1

2

3

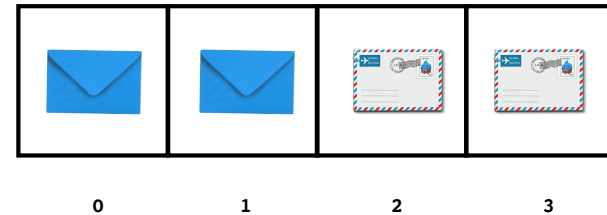
## Priority Queue: Operations

**find-max**: returns the next element with a highest priority value. Like **peek**, does not modify the queue.



## Priority Queue: Operations

**extract**: removes and returns the next element with a maximum priority value. Like **dequeue**.



## Priority Queue

How to implement?

Vector:

**find-max**:  $O(1)$

**insert**:  $O(n)$

**extract**:  $O(n)$

BinarySearchTree:

**find-max**:  $O(n)$

**insert**:  $O(n)$

**extract**:  $O(n)$

Heap:

**find-max**:  $O(1)$

**insert**:  $O(\log n)$

**extract**:  $O(\log n)$

## Priority Queue

Is it **necessary** to keep the **entire queue** in sorted order?

Operations:

**find-max**

**insert**

**extract**

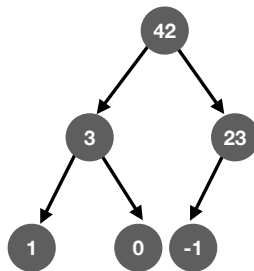
## Heaps

## Max Heap

A **max heap** is a tree-based data structure that returns its elements in **priority order**. A heap maintains the **max heap property**: for any given node **n**, if **p** is a parent node of **n**, then the **key** of **p** is  $\geq$  to the **key** of **n**.

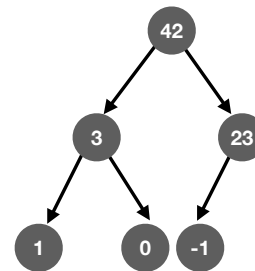
A max heap is a tree whose root is the maximum element and whose subtrees are, themselves, heaps.

Is this a binary search tree?



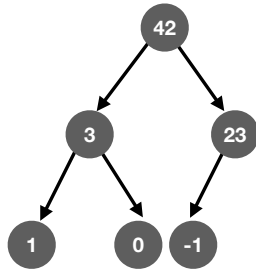
No. Values do not obey **binary search property**.

(Binary) max heap



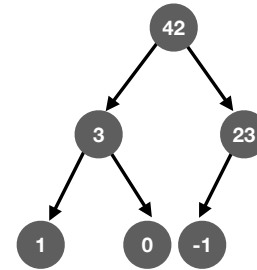
**Max heap property**: for any given node **n**, if **p** is a parent node of **n**, then the **key** of **p** is  $\geq$  the **key** of **n**.

## Insertion



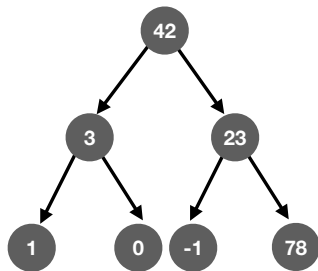
A **binary heap** is usually implemented as an **always-complete binary tree**.

## Insertion



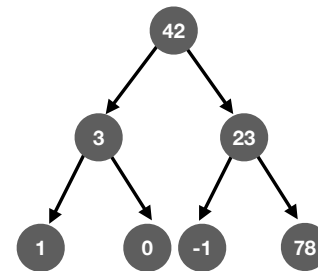
Suppose we want to insert a new node, **78**

## Insertion



First, **insert** the new node at the first available position in the tree that **maintains completeness**.

## Insertion

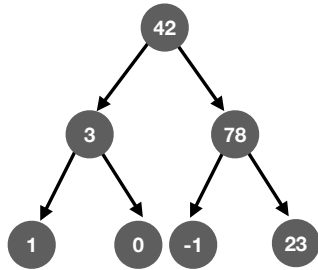


$23 \geq 78$  ?

No.

Next, **compare** the new node with its parent.

## Insertion

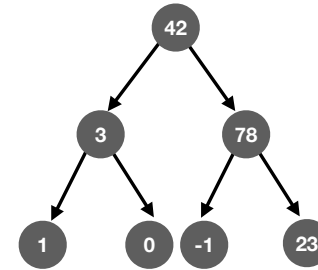


$23 \geq 78$  ?

No.

If the **max heap property** is violated, **swap**.

## Insertion

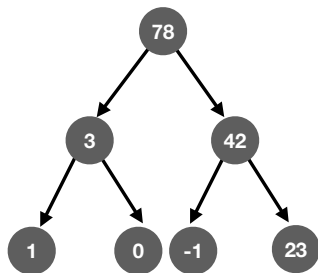


$42 \geq 78$  ?

No.

**Continue swapping** the new node with parents until the **max heap property is satisfied**.

## Insertion

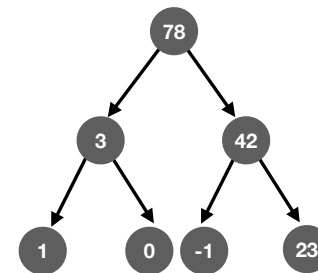


$42 \geq 78$  ?

No.

**Continue swapping** the new node with parents until the **max heap property is satisfied** (parent  $\geq$  node or no parents remain).

## Insertion

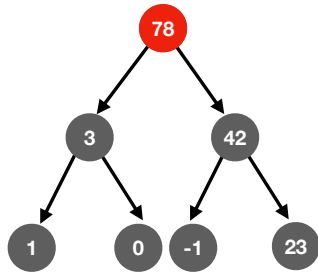


$42 \geq 78$  ?

No.

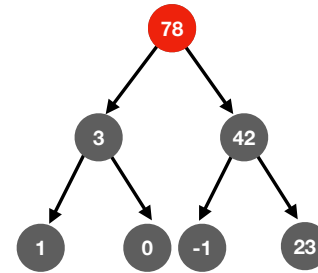
The **swapping procedure** performed on **insert** is often referred to as **heap-up** or **percolate-up**.

## Find-max



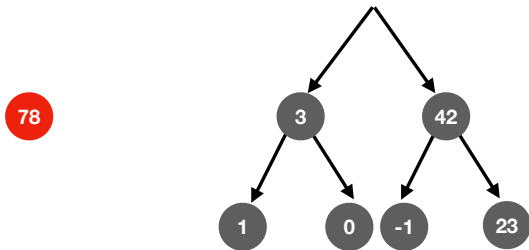
To find the **maximum element** in a max heap, simply **return** the **root**.

## Extract



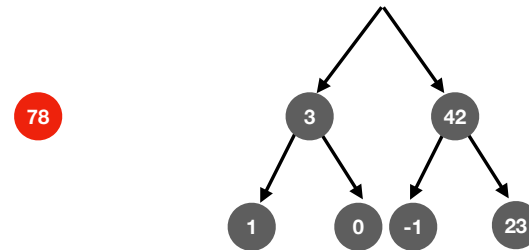
To **remove and return** the **maximum element** in a max heap, first perform **find-max**.

## Extract



**Temporarily store** the max element.

## Extract

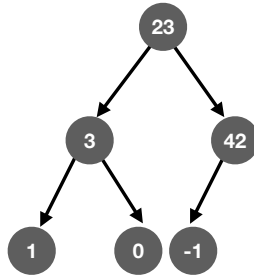


**Replace** the **root** with the **last element** in the complete tree.



## Extract

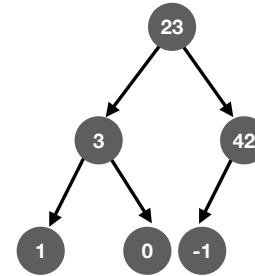
78



**Replace** the **root** with the **last element** in the complete tree.

## Extract

78

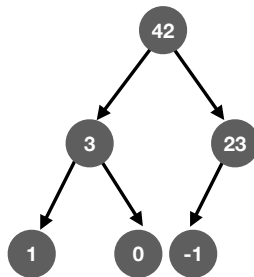


$23 \geq 42$  ?  
No.

**Compare** the root with its children. **Swap** the **root** with **the largest element**.

## Extract

78

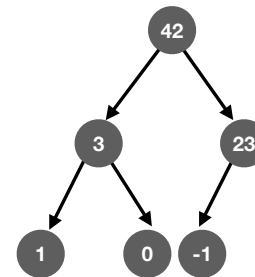


$23 \geq 42$  ?  
No.

**Compare** the root with its children. **Swap** the **root** with **the largest element**.

## Extract

78

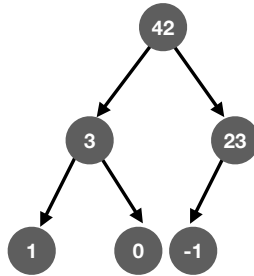


$23 \geq -1$  ?  
Yes.

**Continue swapping** until the **max heap property is satisfied** (parent  $\geq$  node or no parents remain).

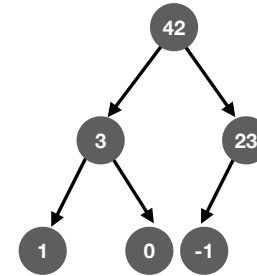
## Extract

78



**Return** the saved maximum element.

## Extract



The **swapping procedure** performed on **extract** is often referred to as **heap-down** or **percolate-down**.

## Recap & Next Class

### Today:

Priority queues

Heaps

### Next class:

More heaps!