

CSCI 136:  
Data Structures  
and  
Advanced Programming

Lecture 25

Trees, part 5

Instructor: Dan Barowy

**Williams**

## Announcements

Office hours today: 5-7pm

1st years: academic advising.

Pre-registration info session: 4-5pm,  
Wege Auditorium

Speaker: Steve Lombardi from  
Oculus, 2:30-4pm, Wege Auditorium

## Outline

Review: Priority queues

Heaps

Quiz

## Recall: 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**.

## Blue letter



# Priority Queue



0

1

2

3



Ordinary letter



Blue letter

# Priority Queue

## enqueue



0

1

2

3



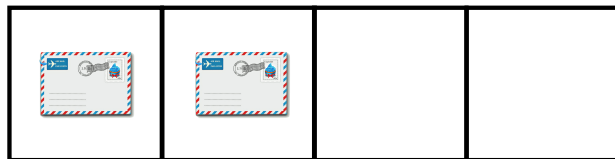
Ordinary letter



Blue letter

# Priority Queue

## enqueue



0

1

2

3



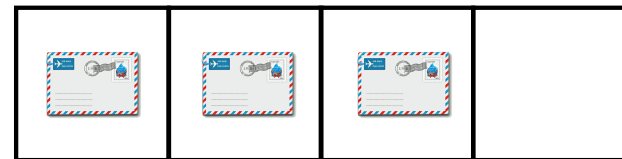
Ordinary letter



Blue letter

# Priority Queue

## enqueue



0

1

2

3



Ordinary letter



Blue letter

# Priority Queue

extract



0

1

2

3



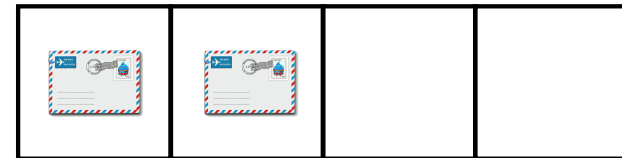
Ordinary letter



Blue letter

# Priority Queue

extract



0

1

2

3



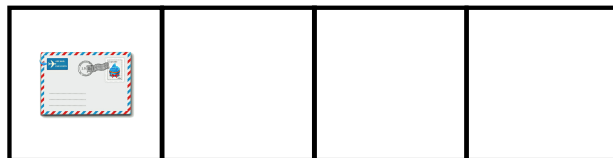
Ordinary letter



Blue letter

# Priority Queue

extract



0

1

2

3



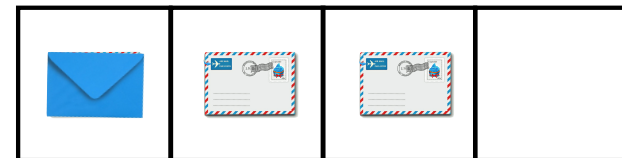
Ordinary letter



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

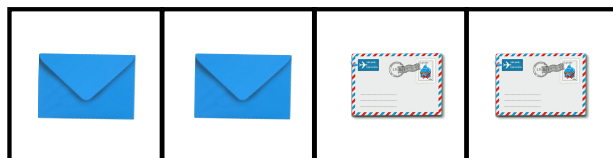
1

2

3

## Priority Queue: Operations

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



0

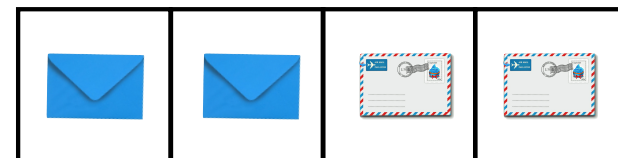
1

2

3

## Priority Queue: Operations

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



0

1

2

3

## 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**

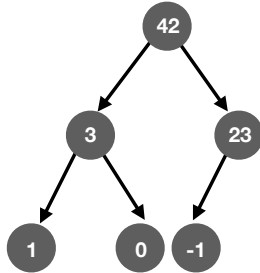
## Heaps

## 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**.

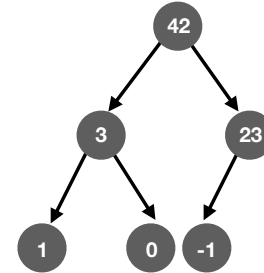
A max heap is a tree whose root is the maximum element and whose subtrees are, themselves, heaps.

Is this a binary search tree?



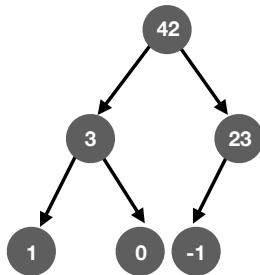
No. Nodes do not obey **binary search property**.

(Binary) max heap



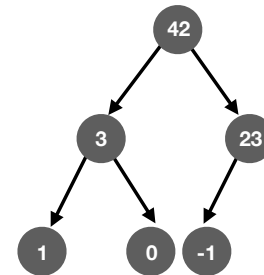
**Max heap property:** for any given node  $n$ , if  $p$  is a parent node of  $n$ , then the **key** of  $p$  is  $\geq$  the **key** of  $n$ .

Insertion



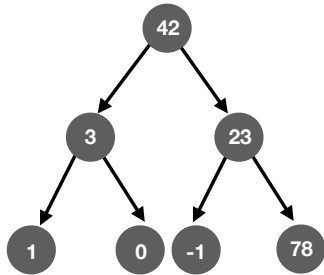
A **binary heap** is usually implemented as an **always-complete binary tree**.

Insertion



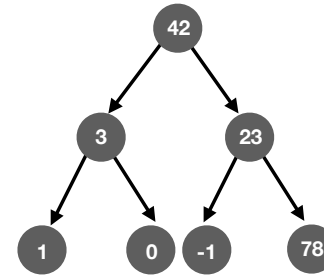
Suppose we want to insert a new node, **78**

## Insertion



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

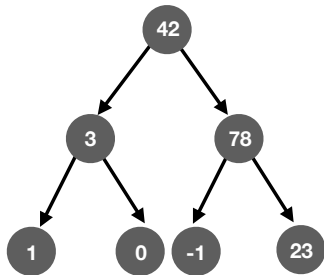
## Insertion



$23 \geq 78$  ?  
No.

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

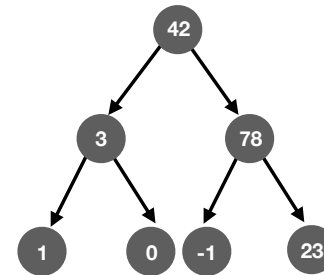
## Insertion



$23 \geq 78$  ?  
No.

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

## Insertion

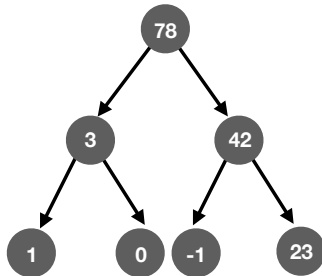


$42 \geq 78$  ?  
No.

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



## Insertion

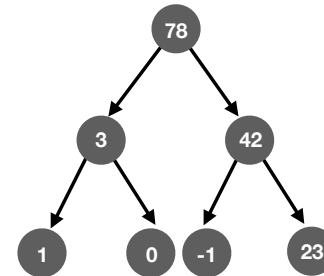


$42 \geq 78$  ?

No.

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

## Insertion

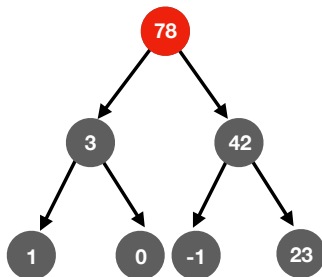


$42 \geq 78$  ?

No.

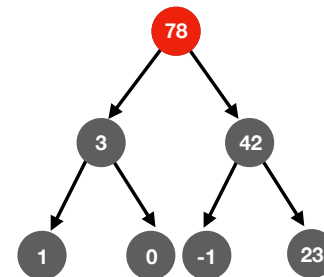
The **swapping procedure** performed on **insert** is often referred to as **heap-up** or **percolate-up**.

## Find-max



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

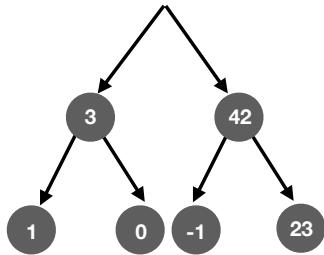
## Extract



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

## Extract

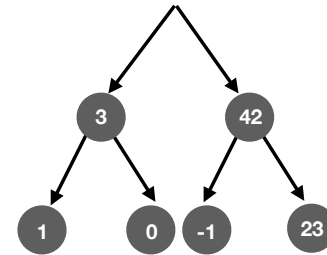
78



Temporarily store the max element.

## Extract

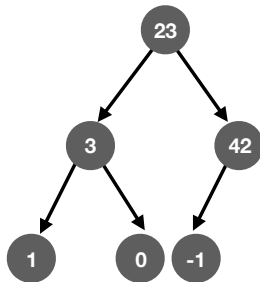
78



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

## Extract

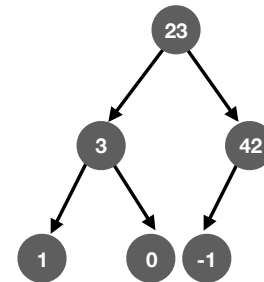
78



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

## Extract

78

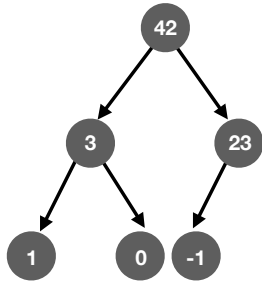


$23 \geq 42$  ?  
No.

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

## Extract

78

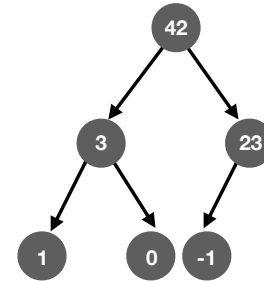


$23 \geq 42$  ?  
No.

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

## Extract

78

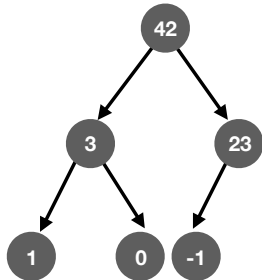


$23 \geq -1$  ?  
Yes.

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

## Extract

78



**Return** the saved maximum element.

## Extract

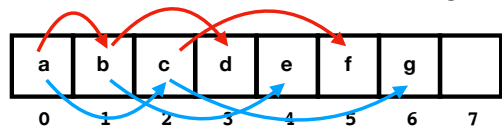
The **swapping procedure** performed on **extract** is often referred to as **heap-down** or **percolate-down**.

## Activity

Build a max heap from the following elements:



But store the elements in an array (i.e., an implicit binary tree). Process nodes from left to right.



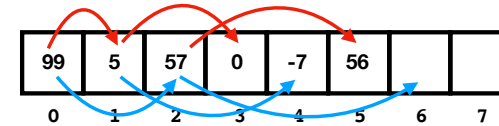
— left child    — right child

$$\text{leftChild}(i) = 2 \times i + 1$$

$$\text{rightChild}(i) = 2 \times i + 2$$

$$\text{parent}(i) = \lfloor (i - 1) / 2 \rfloor$$

## Implementation



— left child    — right child

A binary heap is often implemented using an implicit binary tree data structure. In other words, heap nodes are actually stored in an array or vector.

Advantages:

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

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

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

## Lots of interesting variants on heaps!

### Summary of running times [\[edit\]](#)

In the following [time complexities](#)<sup>[5]</sup>  $O(f)$  is an asymptotic upper bound and  $\Theta(f)$  is an asymptotically tight bound (see [Big O notation](#)). Function names assume a min-heap.

Operation	find-min	delete-min	insert	decrease-key	merge
<b>Binary</b> <sup>[5]</sup>	$\Theta(1)$	$\Theta(\log n)$	$O(\log n)$	$O(\log n)$	$\Theta(n)$
<b>Leftist</b>	$\Theta(1)$	$\Theta(\log n)$	$\Theta(\log n)$	$O(\log n)$	$\Theta(\log n)$
<b>Binomial</b> <sup>[5]</sup>	$\Theta(\log n)$	$\Theta(\log n)$	$\Theta(1)^{[a]}$	$\Theta(\log n)$	$O(\log n)^{[b]}$
<b>Fibonacci</b> <sup>[5][6]</sup>	$\Theta(1)$	$O(\log n)^{[a]}$	$\Theta(1)$	$\Theta(1)^{[a]}$	$\Theta(1)$
<b>Pairing</b> <sup>[7]</sup>	$\Theta(1)$	$O(\log n)^{[a]}$	$\Theta(1)$	$\alpha(\log n)^{[a][c]}$	$\Theta(1)$
<b>Brodal</b> <sup>[10][d]</sup>	$\Theta(1)$	$O(\log n)$	$\Theta(1)$	$\Theta(1)$	$\Theta(1)$
<b>Rank-pairing</b> <sup>[12]</sup>	$\Theta(1)$	$O(\log n)^{[a]}$	$\Theta(1)$	$\Theta(1)^{[a]}$	$\Theta(1)$
<b>Strict Fibonacci</b> <sup>[13]</sup>	$\Theta(1)$	$O(\log n)$	$\Theta(1)$	$\Theta(1)$	$\Theta(1)$
<b>2-3 heap</b>	?	$O(\log n)^{[a]}$	$O(\log n)^{[a]}$	$\Theta(1)$	?

a. <sup>a b c d e f g h i</sup> Amortized time.

b. <sup>a</sup>  $n$  is the size of the larger heap.

c. <sup>a</sup> Lower bound of  $\Omega(\log \log n)$ ,<sup>[8]</sup> upper bound of  $O(2^{2\sqrt{\log \log n}})$ .<sup>[9]</sup>

d. <sup>a</sup> Brodal and Okasaki later describe a [persistent](#) variant with the same bounds except for decrease-key, which is not supported. Heaps with  $n$  elements can be constructed bottom-up in  $O(n)$ .<sup>[11]</sup>

From [Wikipedia: priority queue](#) page.

## Recap & Next Class

Today we learned:

Priority queues

Heaps

Next class:

Graphs