

# **5SENG003W - Algorithms, Week 7**

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# RECAP

Last week. . .

- ▶ We talked about the balanced trees
  - ▶ Why?
    - ▶ Guaranteed  $O(\log(n))$  complexity for search, insertion, deletion
    - ▶ Unbalanced trees only guarantee  $O(n)$
  - ▶ How?
    - ▶ Additional data in nodes: height, balance factor
    - ▶ Rotation operations
    - ▶ Left / Right / Left-right / Right-left

# Overview of today's lecture

- ▶ Lists, queues and priority queues
  - ▶ Interfaces built on top of underlying data structures
  - ▶ Defined by specialised **restricted** access
  - ▶ This affects suitability of data structures
- ▶ Heaps
  - ▶ A different kind of ordered tree
  - ▶ Used in priority queues and the Heap Sort algorithm

# Stacks

A **stack** is a data structure containing a collection of items of the same data type that **can only be accessed at one end**, known as the **top** of the stack.

**Items** can be:

- ▶ “**pushed**” onto the stack – that is **added** onto the **top** of the stack,
- ▶ “**popped**” off the stack – that is **removed** from the **top** of the stack.

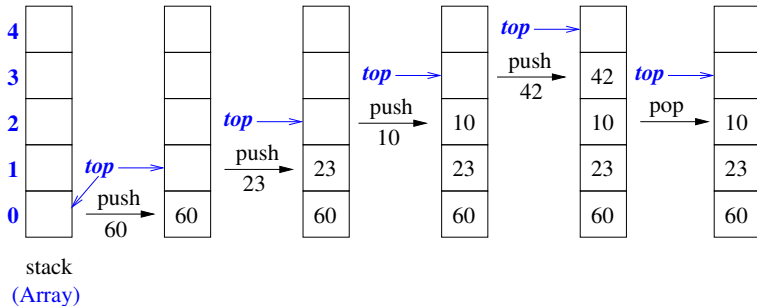
A **stack** is known as a **Last-In-First-Out (LIFO)** data structure. This is because the **last item added to the stack by push**, will be the **first item removed from it by pop**.

The “**top of a stack**” when it is implemented as:

# Examples of Stacks

A **stack** produced by:

```
push(60) ;  
push(23) ;  
push(10) ;  
push(42) ;  
pop() ;
```



Implemented using an array, with **top** as the highest **unused index**.

# Stacks

Uses of stacks include:

- ▶ Anything where you may need to "come back to" previous points (which are stored on the stack)
- ▶ Implementing **recursion** or generally nested **function calls**
  - ▶ When a function is called, a **call frame** is pushed on a stack
  - ▶ The frame underneath is for the calling function which is suspended, waiting for the result
  - ▶ When the call finishes, its frame is popped off the stack; the result is returned to the calling function which then resumes
- ▶ **Backtracking** searches
  - ▶ Trying to get to a target from a starting location
  - ▶ In the current location **L**:
    - ▶ If there is an unexplored neighbour **N**, push L onto the stack and continue from N
    - ▶ Otherwise we are stuck: pop previous location off the stack to check other neighbours

## Example: Call Stack

---

```
int factorial(int n){  
    if(n > 1)  
        return n * factorial(n-1);  
    return 1;  
}
```

---

Factorial(3)
if(3 > 1) return 3 * factorial(2); return 1;

# Example: Call Stack

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```
int factorial(int n){  
    if(n > 1)  
        return n * factorial(n-1);  
    return 1;  
}
```

---

Factorial(2)
if(2 > 1) return 2 * factorial(1); return 1;

Factorial(3)
if(3 > 1) return 3 * factorial(2); return 1;



# Example: Call Stack

---

```
int factorial(int n){  
    if(n > 1)  
        return n * factorial(n-1);  
    return 1;  
}
```

---

Factorial(1)

if(1 > 1)

return 1 \* factorial(0);

return 1;

Factorial(2)

if(2 > 1)

return 2 \* factorial(1);

return 1;

Factorial(3)

if(3 > 1)

return 5 \* factorial(4);

return 1;

## Example: Call Stack

---

```
int factorial(int n){  
    if(n > 1)  
        return n * factorial(n-1);  
    return 1;  
}
```

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Factorial(2)
if(2 > 1) return 2 * 1; return 1;
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if(3 > 1) return 3 * factorial(2); return 1;

## Example: Call Stack

---

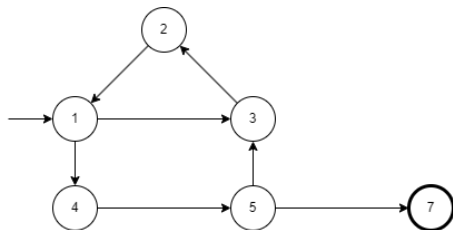
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    return 1;  
}
```

---

Factorial(3)
if(3 > 1) return 3 * 2; return 1;

## Example: Backtracking

Trying to get from **1** to **7** in this graph:



could go like this:

- ▶ Try **1**'s neighbour **3**; stack is now **[1]**.
- ▶ Try **3**'s neighbour **2**; stack is now **[1,3]**.
- ▶ **2** is a dead end. Pop **3** off the stack which is now **[1]**.
- ▶ **3** is a dead end. Pop **1** off the stack which is now empty.
- ▶ Try **1**'s neighbour **4**; stack is now **[1]**.
- ▶ And so on.

# Stacks

Stacks are a **sequential** data structure and can be implemented using indexed or linked data structures, i.e.

- ▶ an **array** (ArrayList, vector, ...) with
  - ▶ a current (possibly fixed, for a plain array) **capacity**
  - ▶ a **size** which is the number of currently stored values
  - ▶ The size is also the **top** index where the next pushed element will go
- ▶ a **list** where
  - ▶ the **top** is the **first node**.
  - ▶ For this purpose a **singly-linked** list is enough.

## Example: List-based Stack, part 1

---

```
import java.util.EmptyStackException;

public class ListStack{
    class ListNode{
        // Contents of this node
        public int data;
        // The node below this one
        public Listnode next;
        public ListNode(int d, ListNode n){
            data = d;
            next = n;
        }
    }

    // Top of the stack; null if stack is empty.
    private ListNode topNode;

    public ListStack(){
        topNode = null;
    }

    // ...
```

---

## Example: List-based Stack, part 2

---

```
// Get the top element
// Throw an exception if the stack is empty.
public int top(){
    if(topNode == null) // stack is empty
        throw new EmptyStackException();
    return topNode.data;
}

// Remove the top node, the one below is the new top.
// Throw an exception if the stack is empty.
public void pop(){
    if(topNode == null) // stack is empty
        throw new EmptyStackException();
    topNode = topNode.next;
}

// Add a new node which becomes the top
public void push(int data){
    topNode = new ListNode(data, topNode);
}
}
```

---

# Queues

A **queue** is a data structure containing a collection of values of the same data type which can be **accessed at both ends**:

- ▶ data items are **queued** (or inserted) at the **back**,
- ▶ data items are **dequeued** (or removed) from the **front**.

The concept of a queue data structure in computing mirrors that in real-life.

A **queue** is a **First-In-First-Out (FIFO)** data structure: items are removed in the same order as they are inserted.



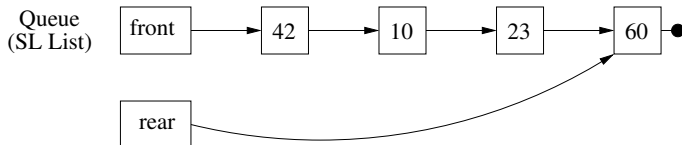
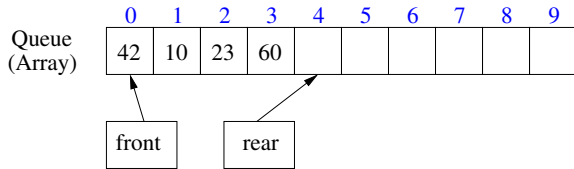
# Queues Example

A **queue** produced by:

---

```
queue (42) ;  
queue (10) ;  
queue (23) ;  
queue (60) ;
```

---



# Example: Array-based Queue

Array-based queue, version 1:

---

```
import java.util.RuntimeException;

public class ArrayQueue{
    public static void capacity = 10;
    private int[] entries;
    int front = 0, back = 0;

    public ArrayQueue(){
        entries = new int[capacity];
    }

    public void queue(int n){
        if(back == capacity) // Out of spaces
            throw new RuntimeException();
        entries[back++] = n;
    }

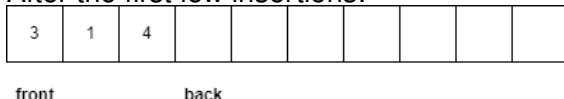
    public int dequeue(){
        if(front == back) // Empty queue
            throw new RuntimeException();
        return entries[front++];
    }
}
```

---

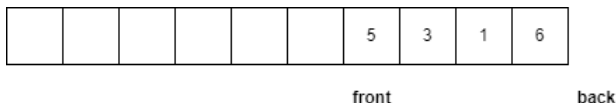
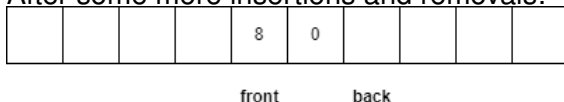
## Example: Array-based Queue

This first version has a problem. For example:

- ▶ After the first few insertions:



- ▶ After some more insertions and removals:



And we cannot enqueue any more values!

Using ArrayList/vector fixes this, but we still get an ever-growing set of "used up" indices.

# Cyclic Queues

By allowing **front** and **back** to wrap around, we can **re-use** array entries:

3	1	4							
---	---	---	--	--	--	--	--	--	--

front

back

				8	0				
--	--	--	--	---	---	--	--	--	--

front

back

						5	3	1	6
--	--	--	--	--	--	---	---	---	---

back

front

9	4							1	6
---	---	--	--	--	--	--	--	---	---

back

front

... as long as we don't run out of space

## Example: Array-based Queue

Array-based queue, version 2:

---

```
public class ArrayQueue{
    public static void capacity = 10;
    private int[] entries;
    int front = 0, back = 0;

    public ArrayQueue(){
        entries = new int[capacity];
    }

    public void queue(int n){
        if((back+1) % capacity == front)
            throw new RuntimeException();
        entries[back] = n;
        back = (back+1) % capacity;
    }

    public int dequeue(){
        if(front == back) // Empty queue
            throw new RuntimeException();
        return entries[front];
        front = (front+1) % capacity
    }
}
```

---

## Example: Array-based Queue

Still to do:

- ▶ Enable the queue to grow instead of throwing an exception when out of space
  - ▶ Replace the array with a bigger one (e.g. doubling the size)
  - ▶ Not a straightforward copy, need to shift appropriately
- ▶ Alternatively: Use a **list** based version
  - ▶ Tutorial!

# Priority Queues

A **priority queue** stores a collection of **(key, data)** values in ascending (or descending) **key** order.

Its **main purpose** is to allow the fast **extraction** of the “**highest**” priority item, i.e. the one with the **minimum key** (we can use the reverse ordering if we want the maximum key instead)

The other main operation is the **insertion** of **(key, data)** values into its appropriate position according to its key value.

The underlying data structure is usually a **heap**.

# Heaps – Implementing Priority Queues

A priority queue is usually implemented using a **heap** which holds **(key, data)** values in either:

- ▶ **ascending** order (**smallest key** at the front, a **min-heap**).
- ▶ **descending** order (**largest key** at the front, a **max-heap**).

We will just look at min-heaps; max-heaps work essentially the same way.

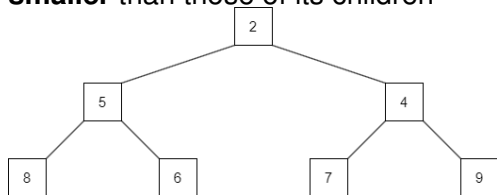
The “**logical**” view of a heap data structure is that of a **binary tree**

- ▶ Not a binary search tree!
- ▶ The requirements make another structure more suitable
- ▶ There are two defining properties of a heap.



# Defining Heaps

The **first property** of a (min-)heap is that each node's key is **smaller** than those of its children



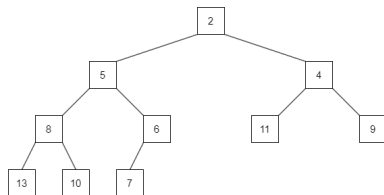
This means that

- ▶ The **minimum** value is always in the **root** node.
- ▶ We only care about the ordering **along each branch**, not between branches

# Defining Heaps

The **second property** is that it has a special structure:

- ▶ All levels except the last one are completely filled
- ▶ The last level is filled from the left
- ▶ So if you read the nodes level by level, left to right, there would be no gaps

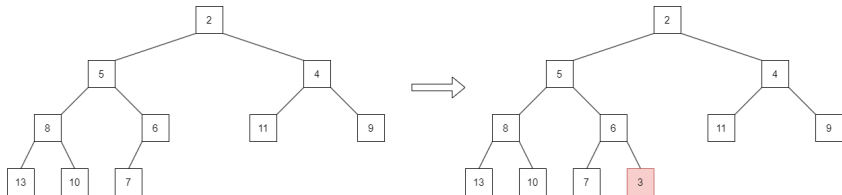


- ▶ This is possible because the ordering is more flexible (keys within a level can occur in any order)
- ▶ It will be important when implementing the heap.

# Heap Operations: Insertion

When inserting a new value we need to preserve the defining properties

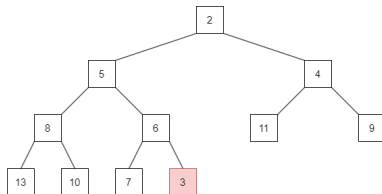
- ▶ For the **structure** property, we can simply place the value in the necessary position
  - ▶ The next position in the final level if not yet complete
  - ▶ The first position in a new level otherwise



# Heap Operations: Insertion

When inserting a new value we need to preserve the defining properties

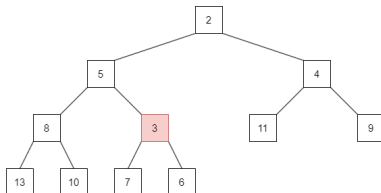
- ▶ Next we need to restore the ordering
  - ▶ Only need to handle the branch containing the new leaf
  - ▶ Essentially perform one iteration of Bubble Sort on this branch
  - ▶ This is called **Sifting Up**.



# Heap Operations: Insertion

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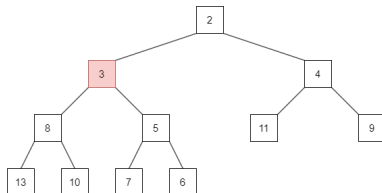
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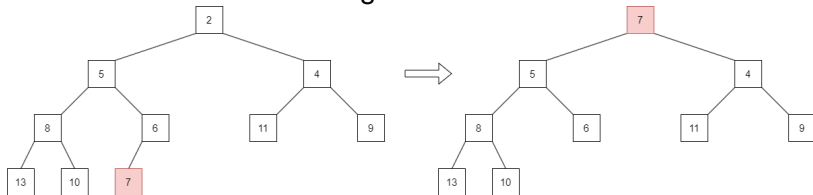
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# Heap Operations: Minimum Extraction

When extracting the minimum we again need to preserve the defining properties

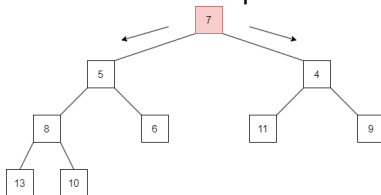
- ▶ For the **structure** property, we need to replace the extracted value
- ▶ The obvious choice is the rightmost value on the last level



# Heap Operations: Minimum Extraction

When extracting the minimum we again need to preserve the defining properties

- ▶ Next we need to restore the ordering
- ▶ This time we want to sift the value **down**
- ▶ But we have two options: **left** or **right**



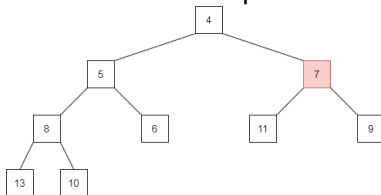
- ▶ Need to choose the **smaller** child, otherwise we would break the ordering again



# Heap Operations: Minimum Extraction

When extracting the minimum we again need to preserve the defining properties

- ▶ Next we need to restore the ordering
- ▶ This time we want to sift the value **down**
- ▶ But we have two options: **left** or **right**



- ▶ Need to choose the **smaller** child, otherwise we would break the ordering again

# Heap Operations: Minimum Replacement

There is a third operation which is sometimes useful:

When extracting the minimum, we may at the same time have a new value to be inserted. In this case,

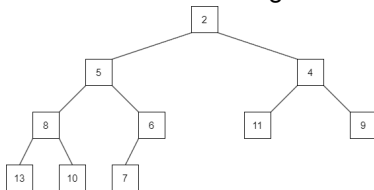
- ▶ Replace the minimum in the root by the new value instead
- ▶ Sift down as before

We will see one example where this occurs later.

# Implementing Heaps

The strict level structure allows us to implement heaps as an **indexed** data structure backed by an array:

- ▶ The values are stored "level by level":
  - ▶ Index 0 contains the root
  - ▶ Indices 1 and 2 contain its children
  - ▶ indices 3-6 contain its grandchildren, etc

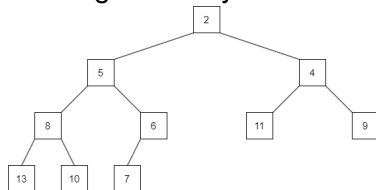


Index	0	1	2	3	4	5	6	7	8	9	
Key	2	5	4	8	6	11	9	13	10	7	...

- ▶ This means we do not need to deal with actual nodes
- ▶ But we do need to figure out details of the sifting operations in terms of array indices

# Implementing Heaps

Looking at the layout of a heap more closely:



Index	0	1	2	3	4	5	6	7	8	9	
Key	2	5	4	8	6	11	9	13	10	7	...

We can see that for a node at position  $k$ ,

- ▶ Its children are always at positions  $2 * k + 1$  and  $2 * k + 2$
- ▶ Its parent is always at position  $(k - 1)/2$
- ▶ For example, the node with key 5 is at position 1 and
  - ▶ Its children (keys 8 and 6) are at positions  $3 = 2 * 1 + 1$  and  $4 = 2 * 1 + 2$
  - ▶ Its parent (key 2) is at position  $0 = (1 - 1)/2$

## Implementing Heaps: Example

The insertion in a heap (using just ints as values for simplicity) could look like this:

---

```
public class MinHeap{
    int[] items;

    public static final int INITIAL_CAPACITY = 1000;
    int size; // Number of values currently in the heap

    public void insert(int newItem){
        // Determine position for insertion:
        // begin at index==size, then sift up
        int index = size++;
        while(index > 0){
            int parent = (index - 1) / 2;
            if(items[parent] <= newItem){ // place here
                items[index] = newItem;
                return;
            }
            items[index] = items[parent];
            index = parent;
        }
    }
}
```

---

# Heap Sort

One use of a heap is the **Heap Sort** algorithm.

A simple version would be:

- ▶ Insert the data from the given array into a heap one at a time
- ▶ Keep extracting the minimum element from the heap until it is empty(storing them in order)
- ▶ This will give you the data in ascending order

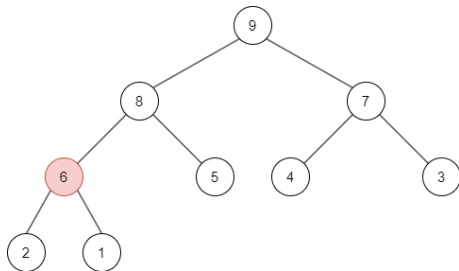
Both insertion and minimum extraction work in time  $O(\log(n))$ , so this is in  $O(n \log(n))$  overall

We cannot go below  $O(n \log(n))$  , but there is an improved version which converts the array into a heap in time  $O(n)$ .

# Heap Sort: the Heapify Operation

The **heapify** operation transforms an array into a heap from the bottom up:

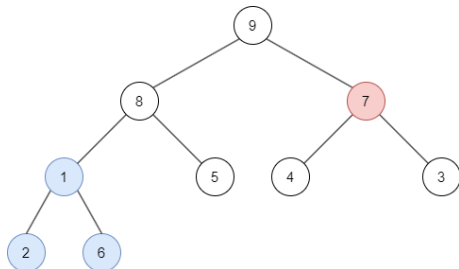
- ▶ Start at the last **non-leaf**, i.e. at the parent index  $k := (\text{size}/2)$
- ▶ Decrease  $k$  after each iteration until it reaches  $-1$
- ▶ In each iteration, **sift down** the element at position  $k$ ; after this the subtree below position  $k$  is a heap.



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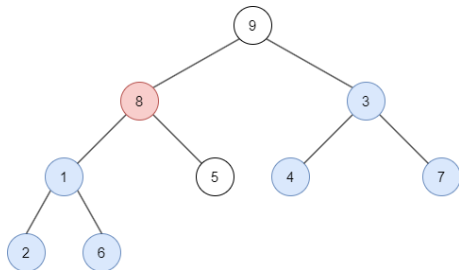




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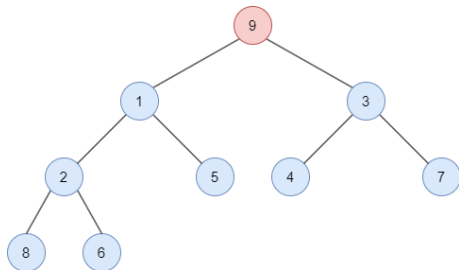
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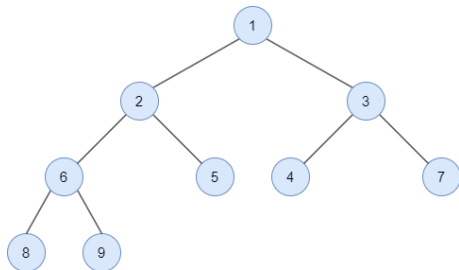
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# Heap Sort: the Heapify Operation

Why is the heapify operation in  $O(n)$ ? Sifting down still takes time in  $O(\log(n))$ , after all!

Consider a complete height 5 heap. It has 31 nodes:

- ▶ 16 leaves which do not get sifted down
- ▶ 8 nodes which may get sifted down once
- ▶ 4 nodes which may get sifted down twice
- ▶ 2 nodes which may get sifted down three times
- ▶ 1 node which may get sifted down four times

So the number of siftings is at most

$$\begin{aligned} & 1 * 8 + 2 * 4 + 3 * 2 + 4 * 1 \\ = & (8 + 4 + 2 + 1) + (4 + 2 + 1) + (2 + 1) + 1 \\ < & 16 + 8 + 4 + 2 \\ < & 31 \end{aligned}$$

i.e. less than the number of nodes.