

# Data Structures

## Sorting

CS284

# Objectives

- ▶ To learn how to implement the following sorting algorithms:
  - ▶ selection sort
  - ▶ bubble sort
  - ▶ insertion sort
  - ▶ heapsort
  - ▶ quicksort
- ▶ To understand the differences in performance of these algorithms, and which to use for small, medium arrays, and large arrays

Heapsort

Quicksort

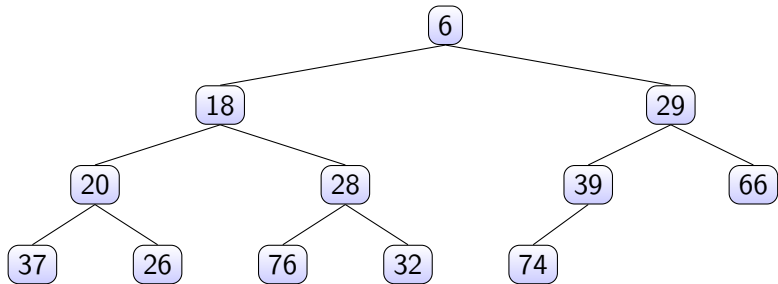
Comparison of Algorithms

# Heapsort

- ▶ Heapsort does not require any additional storage
- ▶ As its name implies, heapsort uses a heap to store the array
  - ▶ When used as a priority queue, a heap maintains a smallest value at the top
  - ▶ Naive heapsort:
    - ▶ place an array's data into a heap,
    - ▶ then remove each heap item and move it back into the array

# Heaps and Priority Queues

- ▶ A **heap** is a complete binary tree with the following properties
  - ▶ The value in the root is the smallest item in the tree
  - ▶ Every subtree is a heap



# Naive Version of a Heapsort Algorithm (MinHeap)

- ▶ This version of the algorithm requires  $n$  extra storage locations

```
// Create a new array for the MinHeap, and insert from the original
// array into the heap array.
i=0
while (heap is not empty) {
    Remove next item from the heap
    Insert it back into the array at position i
    i++
}
```

- ▶ Tracing an example

0	1	2	3	4	5	6	7
15	20	30	45	50	60	80	90

# An in-place solution with MaxHeap

- ▶ We can do better in terms of space usage
- ▶ We can build a heap so that each parent node value is not less than its children (maxHeap)
- ▶ Then,
  - ▶ **move** the top item to the bottom of the heap
  - ▶ reheap, ignoring the item moved to the bottom
- ▶ If we implement the heap as an array,
  - ▶ each element removed will be placed at end of the array, and
  - ▶ the heap part of the array decreases by one element

# Algorithm for In-Place Heapsort

Heapify the input array

```
while (h is not empty) {  
    Remove the first item h by swapping it with the last item in h  
    Restore the heap property on h  
}
```

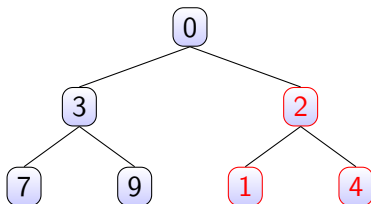
0	1	2	3	4	5	6
0	3	2	7	9	1	4

Example: sorting the array 0, 3, 2, 7, 9, 1, 4



## Step 1: Heapify the array

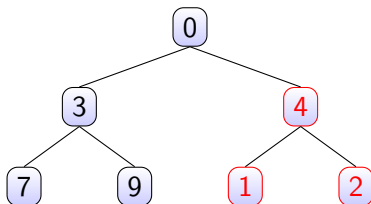
```
for (int i = this.heap.length - 1; i >= 0; i --) {  
    find i's parent and sibling;  
    swap parent with the larger sibling;  
    heapify down the larger sibling;  
}
```



0	1	2	3	4	5	6
0	3	2	7	9	1	4

## Step 1: Heapify the array

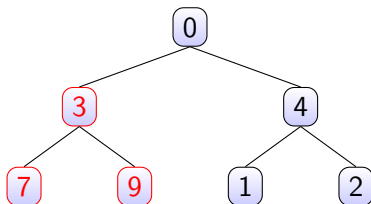
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for (int i = this.heap.length - 1; i >= 0; i --) {  
    find i's parent and sibling;  
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    heapify down the larger sibling;  
}
```



0	1	2	3	4	5	6
0	3	4	7	9	1	2

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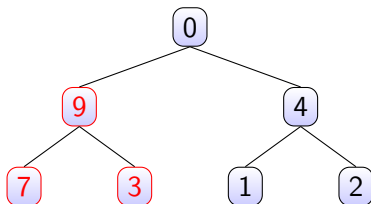
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0	1	2	3	4	5	6
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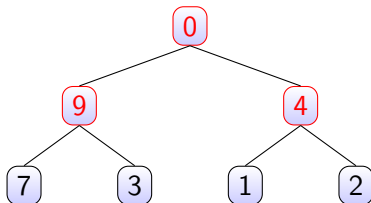
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}
```



0	1	2	3	4	5	6
0	9	4	7	3	1	2

## Step 1: Heapify the array

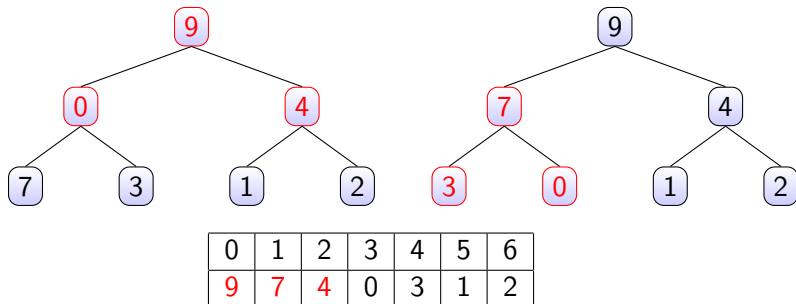
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for (int i = this.heap.length - 1; i >= 0; i --) {  
    find i's parent and sibling;  
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}
```



0	1	2	3	4	5	6
0	9	4	7	3	1	2

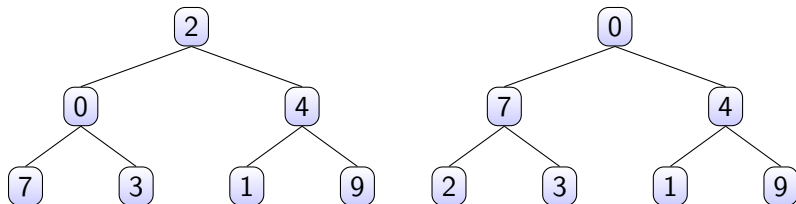
## Step 1: Heapify the array

```
for (int i = this.heap.length - 1; i >= 0; i --) {  
    find i's parent and sibling;  
    swap parent with the larger sibling;  
    heapify down the larger sibling;  
}
```



## Step 2: Poll and place the next largest element

```
for (int i = this.heap.length - 1; i >= 0; i --) {  
    int next_element = this.peak();  
    this.poll();  
    this.heap[i] = next_element;  
}
```



0	1	2	3	4	5	6
0	7	4	2	3	1	9

# Heapsort - Code

```
/** heap sort: (1) heapify the input array
 * (2) for i= length...0
 * remove the i-th smallest element, and
 * append it to the length - i-th position
 * @param array
 */
private void heapSort(int[] array) {
    this.set_array(array);
    this.heapifyAll();
    for (int i = this.heap.length - 1; i >= 0; i --) {
        int next_element = this.peak();
        this.poll();
        this.heap[i] = next_element;
    }
    this.size = this.heap.length;
}
```



# Heapsort - Code

```
private void heapifyAll() {  
    int[] visited = new int[this.heap.length];  
    for (int i = this.heap.length - 1; i >= 0; i --) {  
        int parentIdx = this.getParentIndex(i);  
        if (parentIdx == i)  
            continue;  
        if (visited[i] == 1) continue;  
        int leftChildIdx = this.getLeftChildIndex(parentIdx);  
        int rightChildIdx = this.getRightChildIndex(parentIdx);
```

## Heapsort - Code

```
if (this.heap[leftChildIdx] >
this.heap[rightChildIdx]) {
    swap(leftChildIdx, parentIdx);
    heapifyDown(leftChildIdx);
}
else {
    swap(rightChildIdx, parentIdx);
    heapifyDown(rightChildIdx);
}
visited[leftChildIdx] = 1;
visited[rightChildIdx] = 1;
}
```

## Heapsort - Code

```
private void heapifyDown(int index) {  
    while (hasLeftChild(index)) {  
        int largerChildIndex = getLeftChildIndex(index);  
  
        if (hasRightChild(index) &&  
            rightChild(index) > leftChild(index)) {  
            largerChildIndex = getRightChildIndex(index);  
        }  
  
        if (heap[index] < heap[largerChildIndex]) {  
            swap(index, largerChildIndex);  
        } else {  
            break;  
        }  
        index = largerChildIndex;  
    }  
}
```

# Heapsort - Analysis

- ▶ Heapify:  $O(n \log n)$
- ▶ Poll and place:  $O(n \log n)$
- ▶ Total time complexity:  $O(n \log n)$

Run the demo for heapsort and quicksort

Heapsort

Quicksort

Comparison of Algorithms

# Quicksort

- ▶ Developed in 1962
- ▶ Selects a specific value called a **pivot** and rearranges the array into two parts (called **partitioning**)
  - ▶ all the elements in the left subarray are less than or equal to the pivot
  - ▶ all the elements in the right subarray are larger than the pivot
- ▶ The pivot is placed between the two subarrays
- ▶ The process is repeated until the array is sorted

# Quicksort by Example

- ▶ We'll look at an example
- ▶ We will use a simple partitioning strategy
  - ▶ the pivot is chosen to be the first element in the current subarray to be partitioned

0	1	2	3	4	5	6	7	8
44	75	23	43	55	12	64	77	33

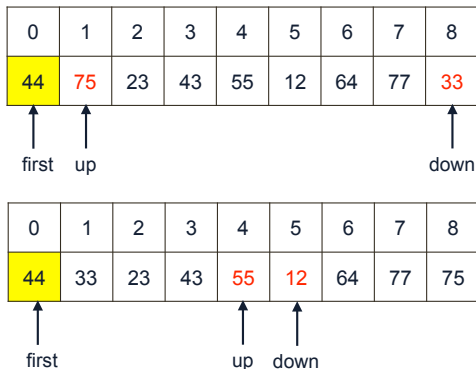
## Divide-and-Conquer using Pivot

```
public void quick_sort(E[] a) {  
    recursive_quicksort(a, 0, a.length - 1);  
}  
  
public void recursive_quicksort(E[] a, int first, int last)  
    int pivIdx = partition(a, first, last);  
    if (first < pivIdx - 1)  
        recursive_quicksort(a, first, pivIdx - 1);  
    if (pivIdx + 1 < last)  
        recursive_quicksort(a, pivIdx + 1, last);  
}
```



# Quicksort Partition: Execution trace

```
int pivIdx = partition(a, first, last);
```



# Quicksort Partition: Execution trace

```
int pivIdx = partition(a, first, last);
```

0	1	2	3	4	5	6	7	8
12	33	23	43	44	55	64	77	75

↑  
first

↑  
down

↑  
up

0	1	2	3	4	5	6	7	8
12	33	23	43	44	55	64	77	75

↑  
first

↑  
pivIdx - 1

↑  
pivIdx + 1

↑  
last

```
quickSort(a, first, pivIdx - 1);
```

```
quickSort(a, pivIdx + 1, last);
```

## Quicksort Partition: Code

```
public int partition(E[] a, int first, int last) {
    E pivot = a[first];
    int up = first;
    int down = last;
    do {
        while ((up < last) && (up<last)
            && (pivot.compareTo(a[up])>=0)) {
            up++; }
        while (down > first && pivot.compareTo(a[down]) < 0) {
            down--;
        }
        if (up < down) { // if up is to the left of down.
            swap(a, up, down);
        }
    } while (up < down); // Repeat while up is left of down.
    swap(a, first, down);
    return down;
}
```

# Analysis of Quicksort

- ▶ If the pivot value is a **random** value selected from the current subarray, then statistically half of the items in the subarray will be less than the pivot and half will be greater
- ▶ If both subarrays have the same number of elements (best case), there will be  $\log n$  levels of recursion

# Analysis of Quicksort

- ▶ At each recursion level, the partitioning process involves moving every element to its correct position ( $n$  moves)
- ▶ Quicksort is  $\mathcal{O}(n \log n)$
- ▶ The array split may not be the best case, i.e. 50-50
- ▶ An exact analysis is difficult (and beyond the scope of this class), but, the running time will be bounded by a constant \*  $n \log n$

## Analysis of Quicksort (cont.)

- ▶ A quicksort will give very poor behavior if, each time the array is partitioned, a subarray is empty.
- ▶ In that case, the sort will be  $\mathcal{O}(n^2)$ 
  - ▶ Prove this with an example
- ▶ Under these circumstances, the overhead of recursive calls and the extra run-time stack storage required by these calls makes this version of quicksort a poor performer relative to the quadratic sorts
- ▶ We'll discuss a solution later

# Revised Partition Algorithm

- ▶ Quicksort is  $\mathcal{O}(n^2)$  when each split yields one empty subarray, which is the case when the array is presorted
- ▶ A better solution is to pick the pivot value in a way that is less likely to lead to a bad split
  - ▶ Use three references: first, middle, last
  - ▶ Select the median of these items as the pivot

Heapsort

Quicksort

Comparison of Algorithms



## Comparison of Sorting

	Number of comparisons		
	Best	Average	Worst
Selection sort	$\mathcal{O}(n^2)$	$\mathcal{O}(n^2)$	$\mathcal{O}(n^2)$
Bubble sort	$\mathcal{O}(n)$	$\mathcal{O}(n^2)$	$\mathcal{O}(n^2)$
Insertion sort	$\mathcal{O}(n)$	$\mathcal{O}(n^2)$	$\mathcal{O}(n^2)$
Shell sort	$\mathcal{O}(n^{7/6})$	$\mathcal{O}(n^{5/4})$	$\mathcal{O}(n^2)$
Merge sort	$\mathcal{O}(n \log n)$	$\mathcal{O}(n \log n)$	$\mathcal{O}(n \log n)$
Heapsort	$\mathcal{O}(n \log n)$	$\mathcal{O}(n \log n)$	$\mathcal{O}(n \log n)$
Quicksort	$\mathcal{O}(n \log n)$	$\mathcal{O}(n \log n)$	$\mathcal{O}(n^2)$