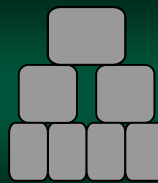




Heaps & Priority Queues

Section 2.4

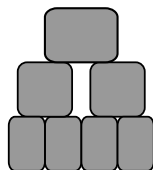


Heaps

Piles of data!

What is a heap?

- A *heap* is a binary tree, but a notable format to the nodes
- The value of a node is smaller (or larger) than **both** of its children
- Every subtree is a heap



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

3

Min and max-heaps

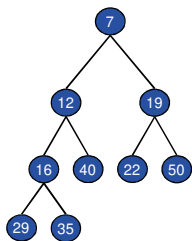
- A *min-heap*
 - stores smaller items (minimal items) at the top of the tree
 - larger items are stored at the bottom
- A *max-heap*
 - stores larger items (maximum items) at the top of the tree
 - smaller items are stored at the bottom

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

4

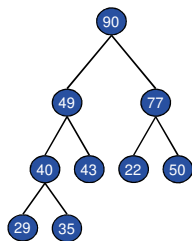
Min and max-heaps



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

5



Terminology Warning



- The *heap data structure* is **not** the same as the operating system's heap
- The two are often confused...
- The Heap data structure is a tree that stores "heavier" objects at the bottom

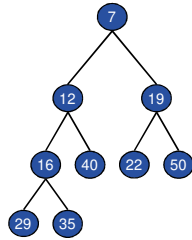
10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

6

Heaps

- Heaps are *complete* binary trees
- Nodes are added in breadth-first order
- The resulting tree is always optimal and *balanced*



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

7

Height of a Heap

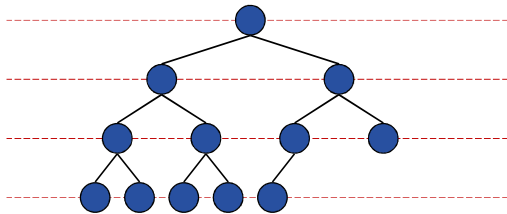
- Let h be the height of the heap
- Let i be the depth of a node
- For all $i = 0, \dots, h - 1$
 - there are 2^i nodes of depth i
 - at depth $h - 1$, the internal nodes are to the left of the external nodes
 - The last node of a heap is the rightmost internal node of depth $h - 1$

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

8

Height of a Heap



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

9

Adding an Node

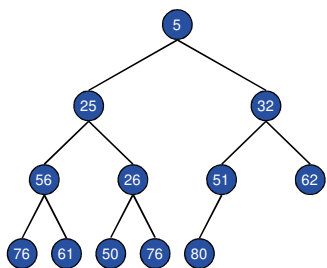
- Begin at next available position for a leaf
- Now the item needs to be *up-heaped*
 - move the entry up depending on its value until a correct position is found
 - as this is done, nodes are swapped entries from parent to child change position
 - since a heap *always* has height $O(\log n)$, upheap runs in $O(\log n)$ time

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

10

Min-heap: Adding a Node 13

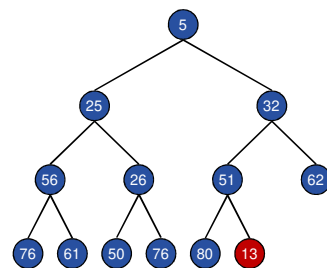


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

11

Min-heap: Upheaping 13

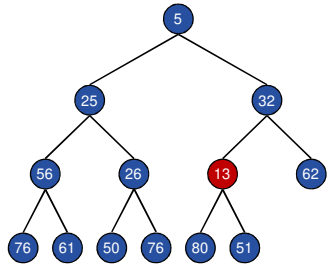


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

12

Min-heap: Upheaping 13

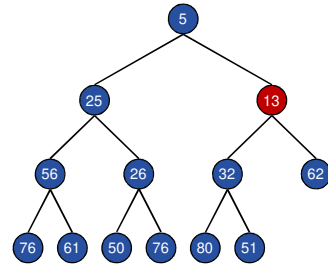


10/1/2019

Sacramento State - Summer 2019 - CS130 - Cook

13

Min-heap: Upheaping 13: Done



10/1/2019

Sacramento State - Summer 2019 - CS130 - Cook

14

Total Up-heap-val

- Just to make matters confusing, up-heap is also known by various other terms – which are all valid
- These are some:
 - bubble-up
 - percolate-up
 - sift-up
 - heapify-up
 - cascade-up

10/1/2019

Sacramento State - Summer 2019 - CS130 - Cook

15

Deleting a Node

- Deleting a node is quite different from adding
- Remember, heaps must maintain *completeness*
- So, the right-most leaf will be involved
- Deletion:
 - remove the node and replace it with the right-most leaf
 - now, this node needs to *down-heap* (moved down) to the correct location
 - since a heap *always* has height $O(\log n)$, down-heap runs in $O(\log n)$ time

10/1/2019

Sacramento State - Summer 2019 - CS130 - Cook

16

Downheap Algorithm

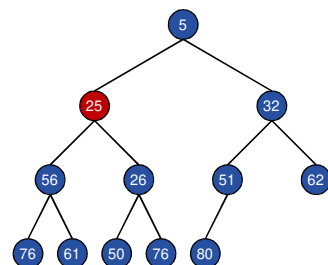
- With a heap, every node has two children
 - as you downheap, you swap nodes
 - so which one do you select?
- Preserve the heap structure ← **vital**
 - on a min-heap, swap with the smallest child
 - on a max-heap, swap with the largest child

10/1/2019

Sacramento State - Summer 2019 - CS130 - Cook

17

min-heap: Deleting 25

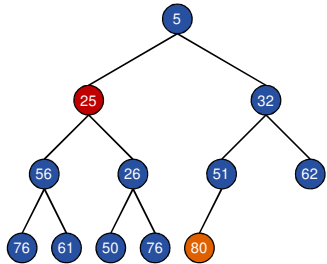


10/1/2019

Sacramento State - Summer 2019 - CS130 - Cook

18

Deleting 25: Replace

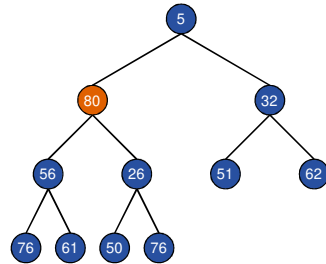


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

19

Deleting 25: Downheaping

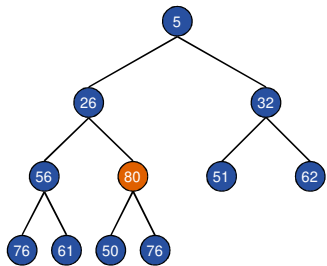


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

20

Deleting 25: Downheaping

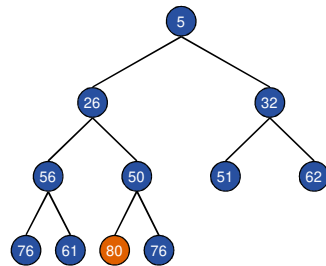


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

21

Deleting 25: Downheaping



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

22

As You Expected...

- Just like up-heap, down-heap has several other, completely valid, names
- These are some:
 - bubble-down
 - percolate-down
 - sift-down
 - heapify-down
 - cascade-down

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

23



Merging
Heaps

Whoa, this is easy!

Merging Heaps

- Merging two heaps is actually quite easy
- One approach is to read one heap into another....
 - read all the data from one heap and add it to the second
 - requires $O(n \log n)$



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

25

Merging Heaps

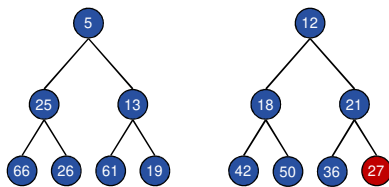
- Or, we can create a new root
 - remember: every subtree in a heap – is a heap
 - so, both trees can be added as a left / right subtree
 - just grab a node at the base of one, make it the root, and downheap
 - requires $O(\log n)$

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

26

Merge Min-heap: Create New Root

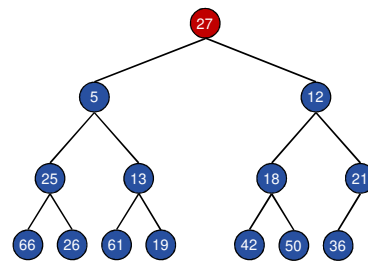


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

27

Merge Min-heap: Create New Root

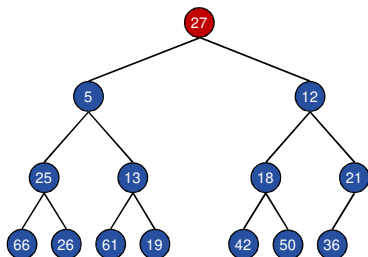


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

28

Merge Min-heap: Downheap

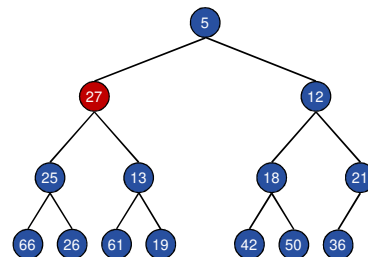


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

29

Merge Min-heap: Downheap

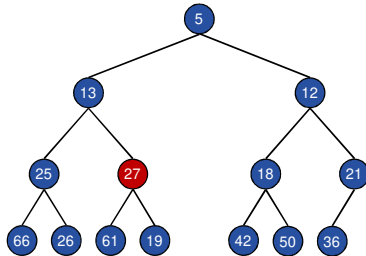


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

30

Merge Min-heap: Downheap

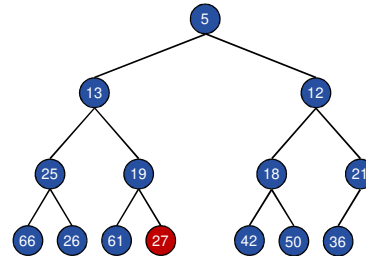


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

31

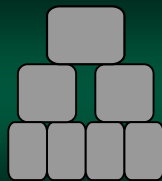
Merge Min-heap: Done



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

32

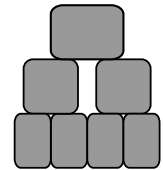


Heaps and Arrays

Not a Heap O' Trouble

Heaps and Arrays

- Heaps are *complete*, balanced, binary trees
- This rigid, predictable, structure...
 - lends itself to being stored in an array
 - each node has a pre-ordained location



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

34

Heaps and Arrays

- Using an array, links between items are not explicitly stored
- Finding the location of an array item can be found using simple mathematics
- Heaps are no different - due to their predictable structure



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

35

Heaps and Arrays

- Any node's parent and children can be computed mathematically
- Heap ADTs only need to...
 - track the index of the end of the heap
 - all new items are added here – before upheap
 - and this is where the last item will be swapped for a deleted item (before it is downheaped)

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

36

Heap Array Math

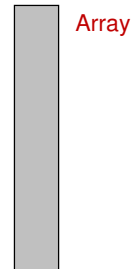
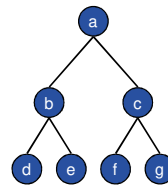
Find	0 Indexed Array	1 Indexed Array
Parent of node i	$(i - 1) / 2$	$i / 2$
Left child of node i	$(2 * i) + 1$	$2 * i$
Right child of node i	$(2 * i) + 2$	$(2 * i) + 1$

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

37

Heap in an Array

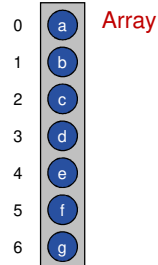
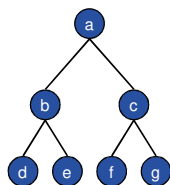


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

38

Heap in an Array



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

39



Queues can play favorites

Priority Queues

- A stack is first-in-last-out
- A queue is first-in-first-out
- A priority queue is *first-in-least-out*



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

41

First-in-Least-Out

- "least" element is the first one removed
- If two items have the same "rank", items can be queued as normal
- The value that is used to determine an item's value is called a "key"



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

42

What is the "Least" Item?

- Meaning of "least" is defined by the ADT
- It is an abstract term and does not mean "minimal"
 - so, "least" can be any way of ranking items
 - ...if the items are mathematically transitive
 - "least" can be the largest value
- Examples
 - by the smallest / largest value
 - size of the data (e.g. files)

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

43

Priority Queue API



public class PriorityQueue	
PriorityQueue ()	Create an empty PQ
void add (Item item)	
Item removeLeast ()	Removes the least item
Item getLeast ()	
bool isEmpty ()	
int size ()	

10/1/2019

Sacramento State - Fall 2019 - CSc 130 - Cook

44

Implementation

- Before we select a data structure to implement a priority queue, we should look how data will be used
- The goal is to get the best time efficiency with as little overhead
- The type data to be stored will influence how the priority queue is implemented



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

45

Implementation

- We can use a basic data structure
 - array
 - linked-list
 - tree
- Or another ADT
 - queue
 - heap

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

46

Implementation with an Array

- Unsorted array
 - adding requires $O(1)$
 - removing requires $O(n)$ – search and moving
- Sorted array
 - adding requires $O(n)$ – find location, move rest
 - removing requires $O(1)$ – if the head of the queue is at the array **end**
- Both approaches are inefficient

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

47

Implementation with a Linked List

- Unsorted linked list
 - adding requires $O(1)$
 - removing requires $O(n)$ – find and delete node
- Sorted linked list
 - adding requires $O(n)$ – find position and insert
 - removing requires $O(1)$ – just remove the head/tail
- Just as inefficient as pure arrays

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

48

Implementation with a Heap

- A priority queue can be implemented as a heap
- Remember...
 - in a heap, all the items below a node have a greater value
 - so, *the root is the least item!*
 - heaps *naturally* implement a priority queue

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

49

Implementation with a Heap

- To enqueue an item...
 - just add to it the heap
 - it will up-heap to the correct position
 - requires $O(\log n)$
- To dequeue an item...
 - just delete the root
 - requires $O(\log n)$ rebalance



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

50

Hybrid Implementations

- In some cases, the key value can have a minor range of values – possibly just a few
- Examples:
 - hospital triage – immediate, delayed, minor
 - computer processes – OS, application, GUI
- We can make clever hybrid structures that maximize efficiency

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

51

Hybrid Implementations

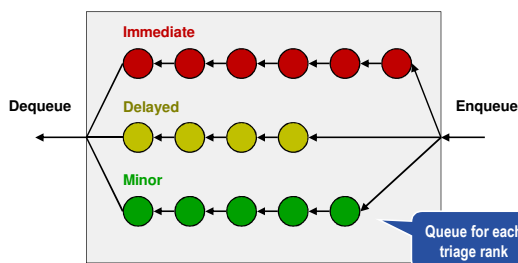
- If the key contains a small number of values, you can use multiple queues – one for each key value
- Basically, the priority queue, internally, will have an array of queues
- Adding/removing items will always be $O(1)$
 - $O(1)$ for the queue head
 - $O(1)$ for enqueue/dequeue (using a linked list)

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

52

Medical Triage – Array of Queues



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

53

... But Heaps are Universal

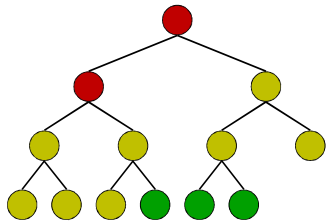
- However, in most cases, the key values have large ranges
- For example, if the key is a 32-bit integer, do you want to create 4 million queues?
- Didn't think so....
- The pure Heap implementation works in all cases

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

54

Medical Triage - Heap

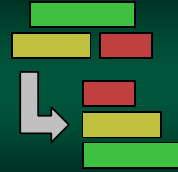


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

55

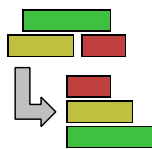
Heap Sort



Heap-a-rific algorithm!

Heap Sort

- *Heap Sort* is an ingenious algorithm that uses a max-heap to sort an array
- John W. J. Williams invented heaps & Heap Sort in 1964
- The same year, the sort was improved by Robert Floyd



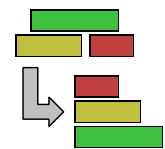
10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

57

Heap Sort

- Heap Sort takes advantage of the fact that a heap is a natural priority queue
- ... and that a heap will always add / remove from the right-most leaf



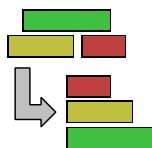
10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

58

Heap Sort Works in Two Phases

- Phase 1: Heapify
 - the sort first converts the existing array into a heap
- Phase 2: Empty the heap
 - removes all the nodes (treating it as priority queue)
 - sorted data is added to the end of the array



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

59

Implementation

- Both the "heap" and the remaining array can be used in memory at the same time
- The sorted array is stored at the empty space after the end of the heap
- This concept works for both Phase 1 and Phase 2

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

60

Phase 1: Array → Heap

- In Phase 1, we convert the array into a max-heap. This step is called *heapify*.
- Remember....
 - a heap can be stored in an array
 - so, we can just look at the array as a heap
 - ...but, its not quite a heap yet
 - data needs to be moved around until it is a heap

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

61

How do we convert it?

- First approach: *top-down*
 - start building the heap at the top of the array
 - iterate *i* starting at 0 and build a heap above *i*
 - item are *upheaped*
- Second approach: *bottom-up*
 - fastest approach is to downheap all the leaves
 - run the *downheap*, at the root, all the leaves

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

62

Phase 1: Heapify

```
n = count-1; //last item

while (n >= 0)
{
    downHeap(array, n, count-1)
    n--;
}
```

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

63

Phase 1: Heapify

```
heapify(array, count)
{
    last = count - 1;
    n = last; //last item

    while (n >= 0)
    {
        downHeap(array, n, last)
        n--;
    }
}
```

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

64

Phase 2: Root Deletion

- Now that the array is a *max-heap*, the root contains the *maximum* item
- If we remove the root, we have the *last* item in a sorted array!
- OMG! Sooooo, awesome!



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

65

Phase 2: Root Deletion

- Remember, when we remove the root...
 - right-most leaf is moved to the root and downheaped into the correct position
 - this leaf position is now empty



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

66

Phase 2: Root Deletion

- We can put the root, we just removed, in this new empty space
- *What a sec!* We just put the largest item in the last position in the array
- The value, now at the root of the heap, is the second largest item in the array

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

67

Phase 2: Root Deletion

- So, to sort the array....
 - so, we just keep removing the root and placing it position where the leaf was located
 - the "heap" section of the array shrinks as the sorted array grows from the bottom
 - wow, that's easy!

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

68

Heap Sort Algorithm

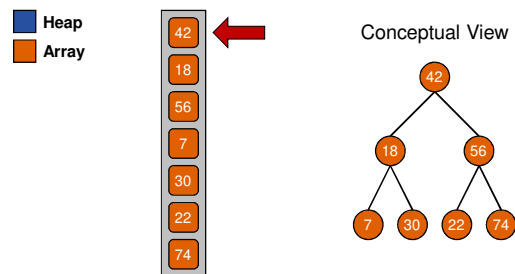
```
last = count - 1;
heapify(array, 0, last);
while (last > 0)
{
    // swap root and array[last]
    downHeap(0, last - 1);
    last--;
}
```

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

69

Phase 1 – Top-down Convert

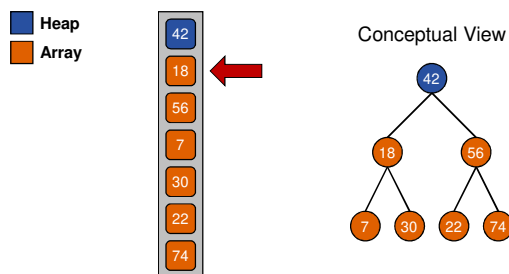


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

70

Phase 1 – Top-down Convert

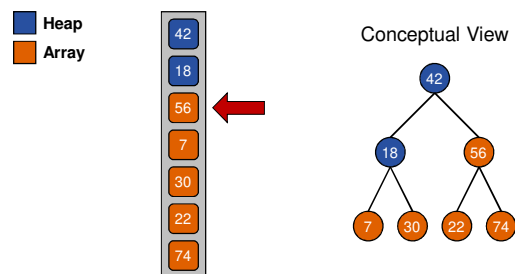


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

71

Phase 1 – Top-down Convert

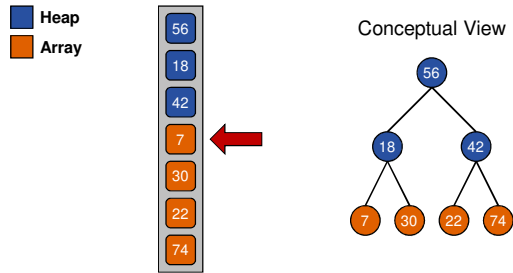


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

72

Phase 1 – Top-down Convert

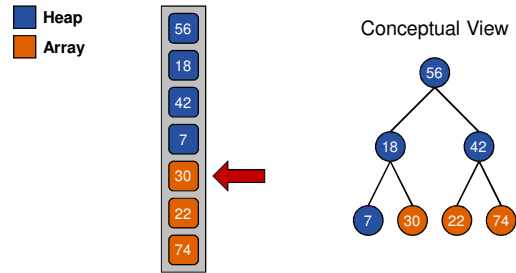


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

73

Phase 1 – Top-down Convert

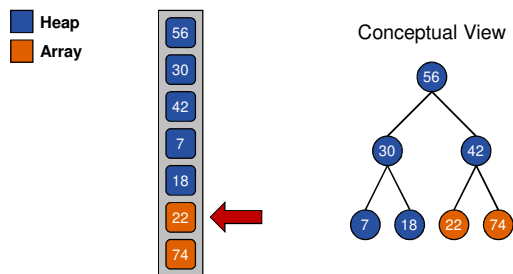


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

74

Phase 1 – Top-down Convert

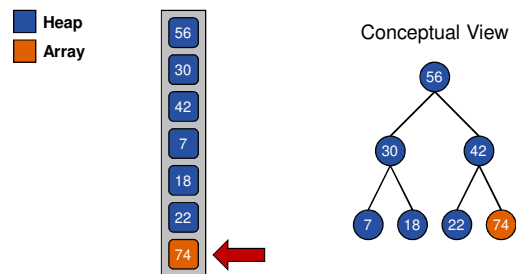


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

75

Phase 1 – Top-down Convert

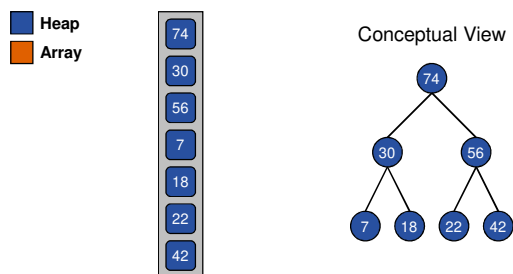


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

76

Phase 1 – Complete!

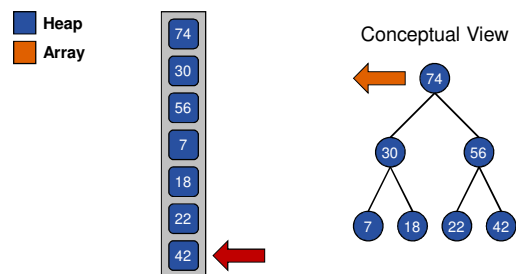


10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

77

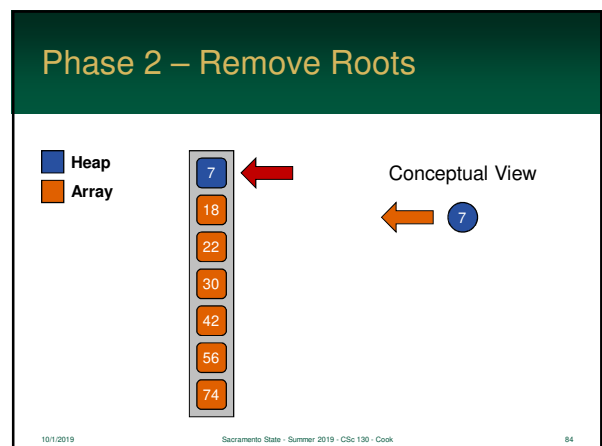
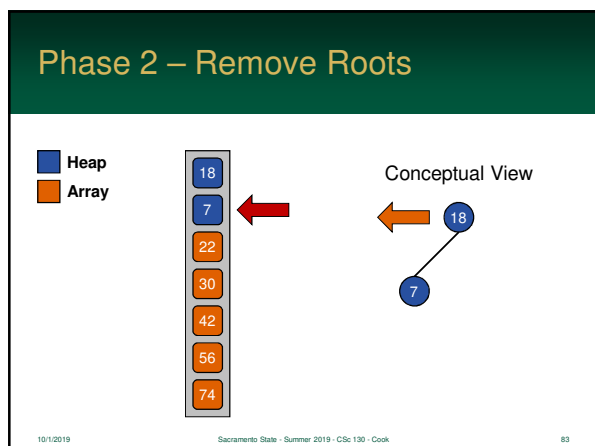
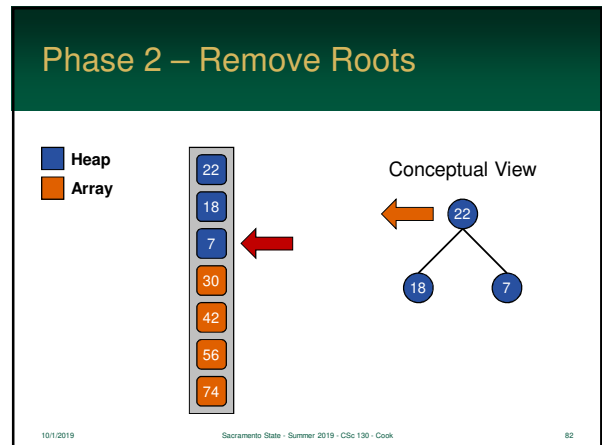
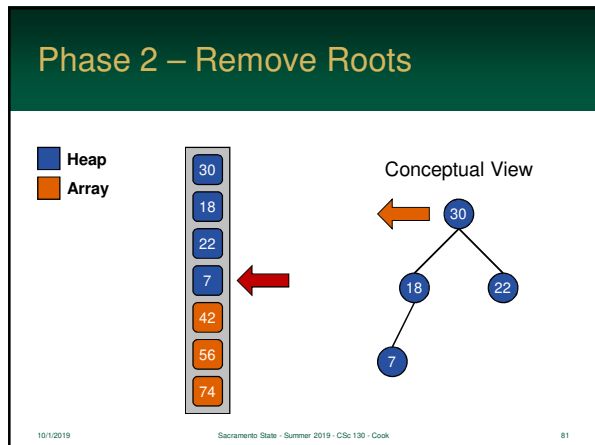
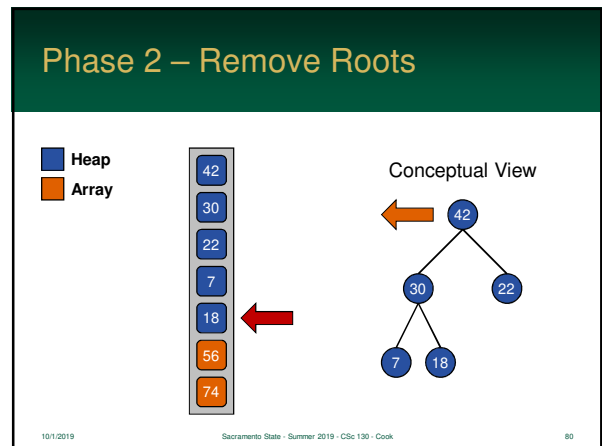
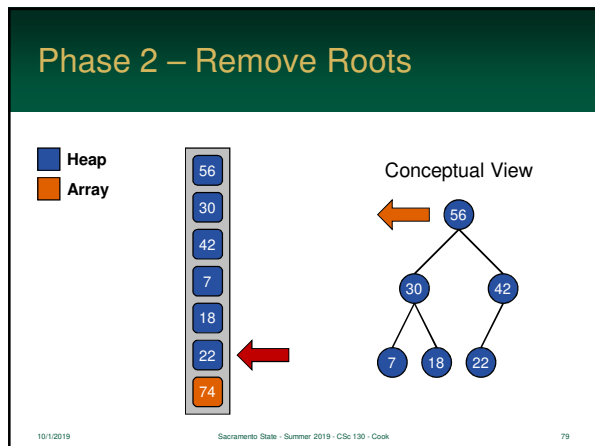
Phase 2 – Remove Roots



10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

78



Phase 2 – Complete!

■ Heap
■ Array



Conceptual View

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

85

Merge Sort vs. Heap Sort

- Heap-Sort allows us to sort any array in $O(n \log n)$ just like Merge-Sort & Quicksort
- However, there is no overhead
 - Heap-Sort can be sorted in-place, meaning auxiliary storage is $O(1)$
 - Merge-Sort, however, requires $O(n)$
 - Quick-Sort can become $O(n^2)$

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

86

Merge Sort vs. Heap Sort

- However, in some cases, the recursive nature of Merge Sort is better
 - easy to distribute to multiple computers
 - Heap-Sort uses the entire array – not online
- But...in the Real World, it gets complex
 - you can cut an array into sub-lists, send them to different machines which Heap-Sort them
 - ... and then you Merge

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

87

Heap Sort Summary

Heap Sort	
Time Average	$O(n \log n)$
Time Best	$O(n \log n)$
Time Worst	$O(n \log n)$
Auxiliary space	$O(1)$
Stable	No – Equal element order not preserved
Online?	No

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

88

Summary of Sorting Algorithms

Algorithm	Best	Average	Worst	Aux. Storage
Bubble Sort	$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Selection Sort	$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Insertion Sort	$O(n)$	$O(n^2)$	$O(n^2)$	$O(1)$
Shell Sort	$O(n \log n)$	$O(n^{5/4})$	$O(n^{3/2})$	$O(1)$
Merge Sort	$O(n \log n)$	$O(n \log n)$	$O(n \log n)$	$O(n)$
Quick Sort	$O(n \log n)$	$O(n \log n)$	$O(n^2)$	$O(1)$
Heap Sort	$O(n \log n)$	$O(n \log n)$	$O(n \log n)$	$O(1)$

10/1/2019

Sacramento State - Summer 2019 - CSc 130 - Cook

89