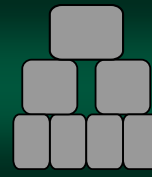




## Heaps & Priority Queues

Part 9

1



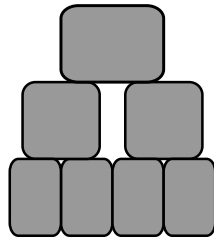
## Heaps

Piles of data!

2

### 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



Spring 2024

Recursion: Stack - CSCI 120

3

3

### Terminology Warning



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

Spring 2024

Recursion: Stack - CSCI 120

4

4

### Min and max-heaps

- *Min-heap*
  - each of a node's descendants have a "heavier" value
  - stores smaller items (minimal items) at the top of the tree
- *Max-heap*
  - each node's parent has a "heavier" value
  - stores larger items (maximum items) at the top of the tree

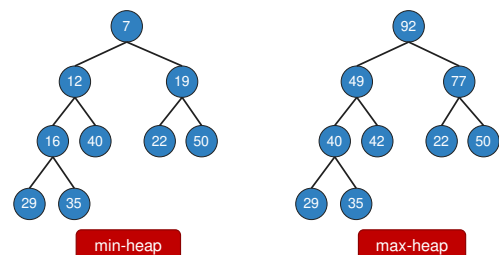
Spring 2024

Recursion: Stack - CSCI 120

5

5

### Min and max-heaps



Spring 2024

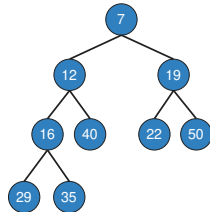
Recursion: Stack - CSCI 120

6

6

## Heaps

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



Spring 2024

San Francisco State - CS&E - CS131

7

7

## Height of a Heap

- Let  $i$  be the depth of a node
- Then, there are  $2^i$  nodes of depth  $i$
- Heap *always* has a height of  $\log_2(n)$



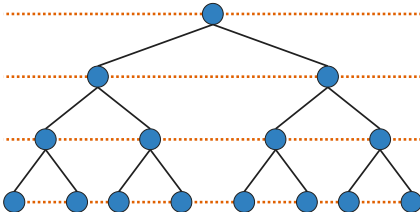
Spring 2024

San Francisco State - CS&E - CS131

8

8

## Height of a Heap



Spring 2024

San Francisco State - CS&E - CS131

9

9

## Adding a 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 - parent to child change position
  - since a heap *always* has height  $\log_2(n)$ , upheap runs in  $O(\log n)$  time

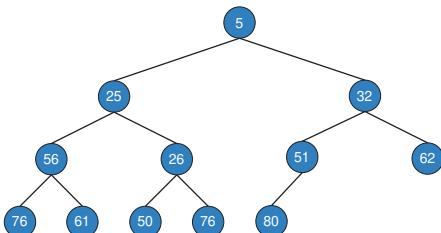
Spring 2024

San Francisco State - CS&E - CS131

10

10

## Min-heap: Adding a Node 13



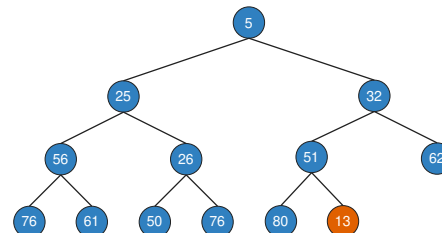
Spring 2024

San Francisco State - CS&E - CS131

11

11

## Min-heap: Adding a Node 13



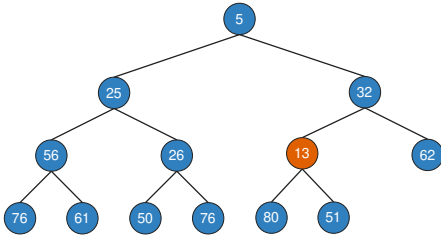
Spring 2024

San Francisco State - CS&E - CS131

12

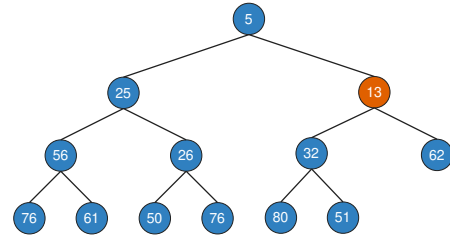
12

## Min-heap: Adding a Node 13



13

## Min-heap: Adding a Node 13



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

15

## Deleting a Node

- Deleting a node is quite different from adding
- Heaps must maintain *completeness*
  - so, the right-most leaf is needed to replace the deleted node
  - why? We replace the deleted node with the last one added.

16

## Deleting a Node

- The steps to delete:
  - remove the node
  - replace it with the right-most leaf
  - now, it needs to down-heaped (moved down) to the correct location
- This runs in  $O(\log n)$  time

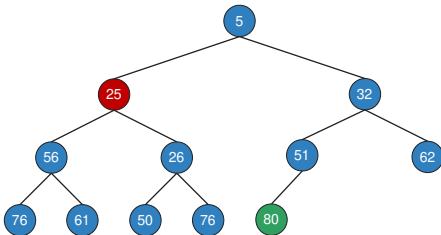
17

## 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

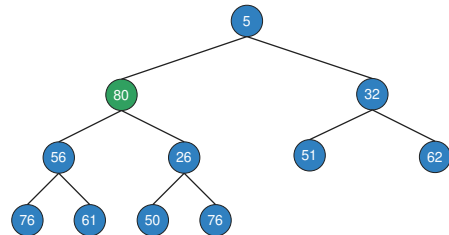
18

## Min-heap: Deleting 25



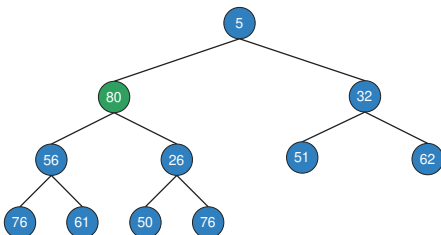
19

## Replace. Now must down-heap.



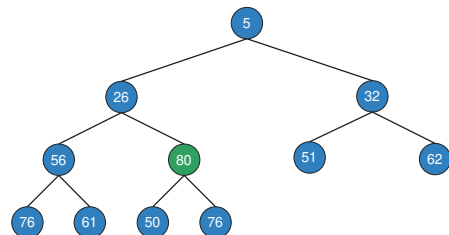
20

## Replace. Now must down-heap.



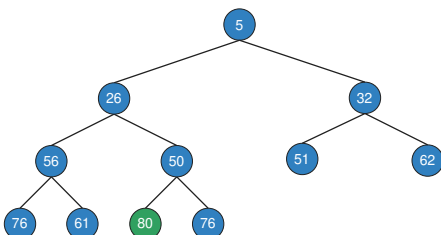
21

## Replace. Now must down-heap.



22

## Replace. Now must down-heap.




23

## 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

24




## Priority Queues

Queues can play favorites

25

## Priority Queues


- A stack is first-in-last-out
- A queue is first-in-first-out
- A priority queue is modification of the queue ADT that follows the logic of *first-in-least-out*



26

## First-in-Least-Out

- The "*least*" element is the first one that is removed
- If two items have the same "rank", items can be queued as normal
- The object's key can be used to determine if it is "least", but any field will do



27

## What is the "Least" Item?

- Meaning of "least" is defined by the ADT
- It is abstract - does not mean "less than"
  - so, "least" can be any way of ranking items
  - ...if the items are mathematically transitive
  - "least" can be the largest value
- Examples of least:
  - the smallest / largest value
  - some ranking classification

28


## Priority Queue Interface

| public class PriorityQueue |                         |
|----------------------------|-------------------------|
| PriorityQueue ()           | Create an empty PQ      |
| void add (Item item)       | Same as enqueue()       |
| Item removeLeast ()        | Same as dequeue()       |
| Item getLeast ()           | Same as peek(), first() |
| bool isEmpty ()            |                         |
| int size ()                |                         |

29

## 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 as possible



30

## Implementation

- The type data to be stored will influence how the priority queue is implemented
- We have quite a few options:
  - array
  - linked-list
  - tree / heap



Spring 2024

Samuelson State - CS&E - CS&E 130

31

31

## Implementation with an Array

- Unsorted array
  - enqueue requires  $O(n)$  – resize array
  - dequeue requires  $O(n)$  – search and moving
- Sorted array
  - enqueue requires  $O(n)$  – find a position to insert and then move the rest
  - dequeue requires  $O(n)$

Spring 2024

Samuelson State - CS&E - CS&E 130

32

32

## Implementation with a Linked List

- Unsorted linked list
  - enqueue takes  $O(1)$
  - dequeue requires  $O(n)$  – find & remove node
- Sorted linked list
  - enqueue requires  $O(n)$  – must find a position and insert
  - dequeue requires  $O(1)$  – just remove the head/tail

Spring 2024

Samuelson State - CS&E - CS&E 130

33

33

## We Need Another Data Structure!

- Arrays have a time complexity of  $O(n)$  for Enqueue and Dequeue
- Linked Lists did have a single  $O(1)$  operation, but the other was  $O(n)$
- Given priority queues are updated often (just like normal queues), arrays and linked lists are poor solutions

Spring 2024

Samuelson State - CS&E - CS&E 130

34

34

## 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

Spring 2024

Samuelson State - CS&E - CS&E 130

35

35

## 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 linked list)

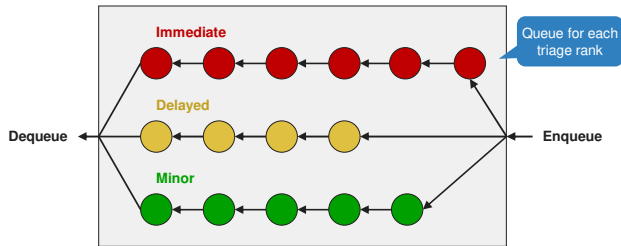
Spring 2024

Samuelson State - CS&E - CS&E 130

36

36

## Medical Triage – Array of Queues



37

## ... 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....
- So, this only works in limited situations

38

## Implementation with a Heap

- However, 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

39

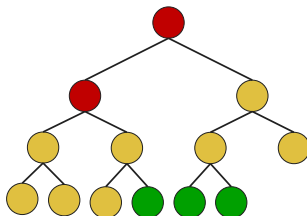
## Implementation with a Heap

- 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 remove the root
  - requires  $O(\log n)$  rebalance

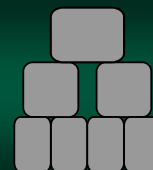


40

## Medical Triage - Heap



41



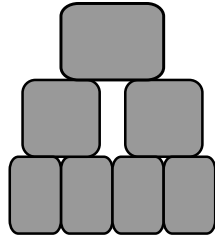
Heaps and  
Arrays

Not a Heap O' Trouble

42

## 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



Spring 2024

Sacramento State - CS&E - CS&E 130

43

43

## 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



Spring 2024

Sacramento State - CS&E - CS&E 130

44

44

## 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)

Spring 2024

Sacramento State - CS&E - CS&E 130

45

45

## 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 $i$ | $(2 * i) + 2$   | $(2 * i) + 1$   |

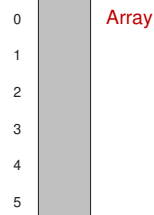
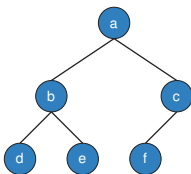
Spring 2024

Sacramento State - CS&E - CS&E 130

46

46

## Heap in an Array



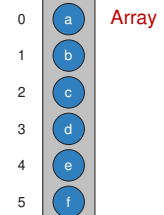
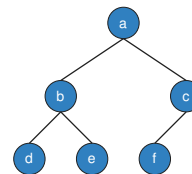
Spring 2024

Sacramento State - CS&E - CS&E 130

47

47

## Heap in an Array



Spring 2024

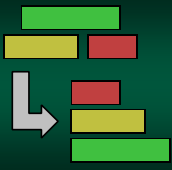
Sacramento State - CS&E - CS&E 130

48

48



## Heap Sort

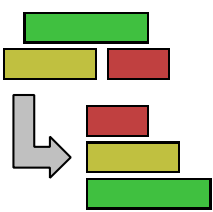


Heap-a-rific algorithm!

49

## Heap Sort

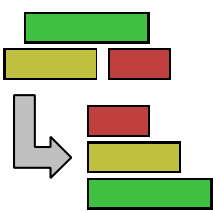
- *Heap Sort* is an **ingenious** algorithm that uses a max-heap to sort an array
- *John W. J. Williams* invented both heaps and the Heap Sort in 1964 (*0 ABW*)
- The same year, the sort was improved by *Robert Floyd*



50

## Heap Sort

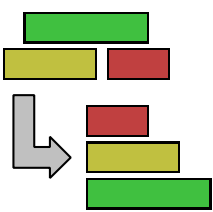
- Heap Sort takes advantage of the fact that a heap is a natural priority queue
- ... and that a heap will **always** add / remove from the right-most leaf



51

## Heap Sort Works in Two Phases

- Phase 1: Heapify
  - converts the existing array into a **max-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



52

## 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

53

## 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 rearranged to turn the array into a heap

54

## 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

Spring 2024

Stacks, Queues, and Heaps

55

## Phase 1: Heapify (top down)

```
procedure heapify(array, count)
    last = count - 1
    n = 0 //First item

    while (n <= last)
        upHeap(array, 0, n - 1)
        n++
    end while
end procedure
```

Spring 2024

Stacks, Queues, and Heaps

56

## Phase 1: Heapify (top down)

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

    while (n >= 0)
        downHeap(array, n + 1, last)
        n--
    end while
end procedure
```

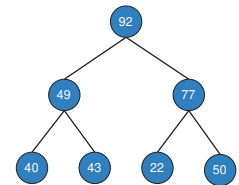
Spring 2024

Stacks, Queues, and Heaps

57

## 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 of the sorted array!**



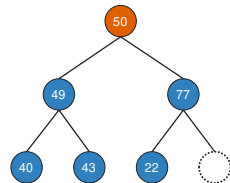
Spring 2024

Stacks, Queues, and Heaps

58

## Phase 2: Root Deletion

- When we remove the root... right-most leaf is moved to the root
- ...and then downheaped into the correct position



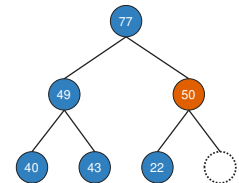
Spring 2024

Stacks, Queues, and Heaps

59

## Phase 2: Root Deletion

- Now the root contains the second-largest item
- This leaf position is now empty**



Spring 2024

Stacks, Queues, and Heaps

60

## Phase 2: Root Deletion

- We can put the root, that was just removed, in this new empty space
- *What a sec!* We just put the largest item in the last position in the array!



Spring 2024

Stacks and Queues - CS50.100

61

61

## 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
- *OMG! Sooooo, awesome!*



Spring 2024

Stacks and Queues - CS50.100

62

62

## Heap Sort Algorithm

```
last = count - 1
heapify(array, 0, last)

while (last > 0)
    swap array[0] and array[last]
    downHeap(0, last - 1)
    last--
end while
```

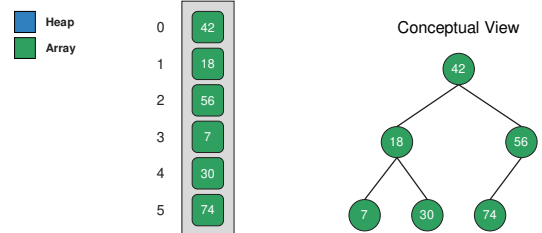
Spring 2024

Stacks and Queues - CS50.100

63

63

## Phase 1 – Top-down Upheap



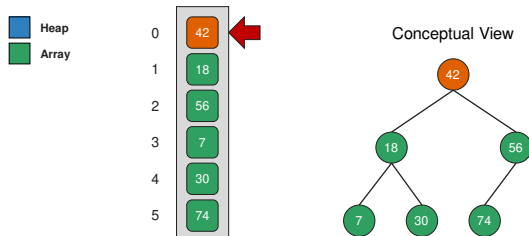
Spring 2024

Stacks and Queues - CS50.100

64

64

## Phase 1 – Top-down Upheap



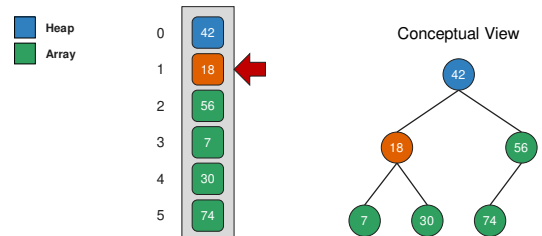
Spring 2024

Stacks and Queues - CS50.100

65

65

## Phase 1 – Top-down Upheap

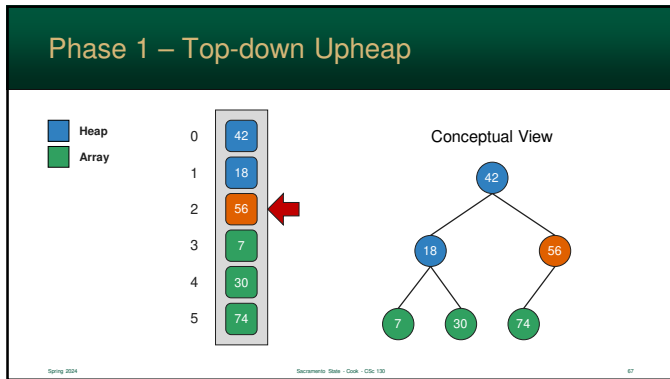


Spring 2024

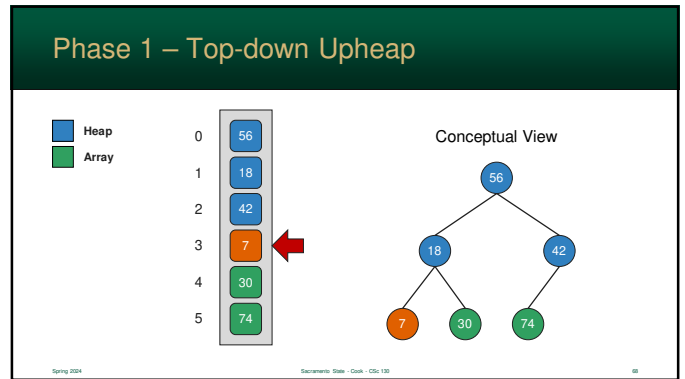
Stacks and Queues - CS50.100

66

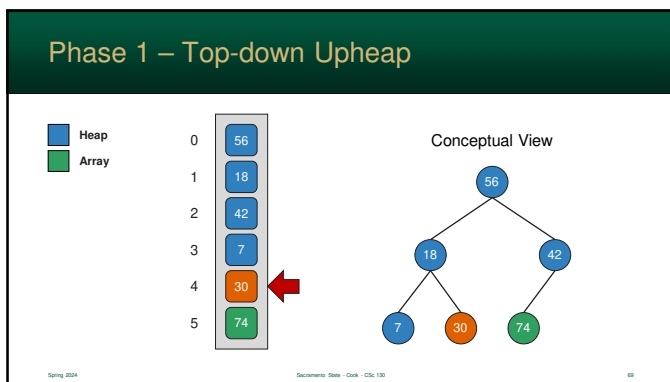
66



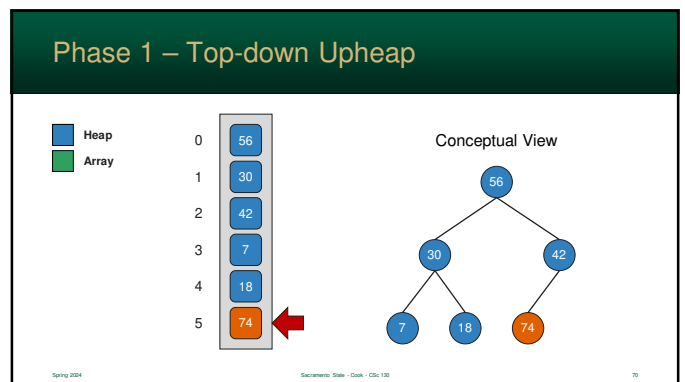
67



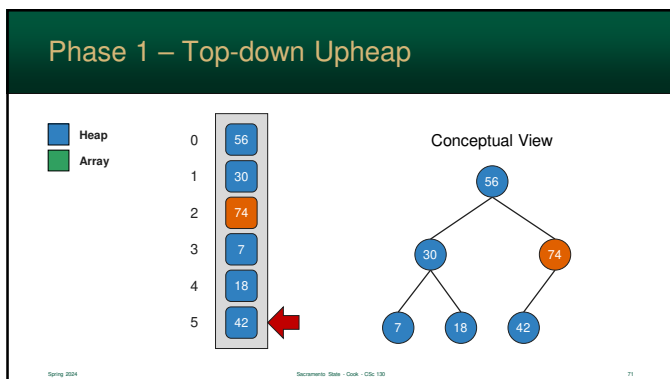
68



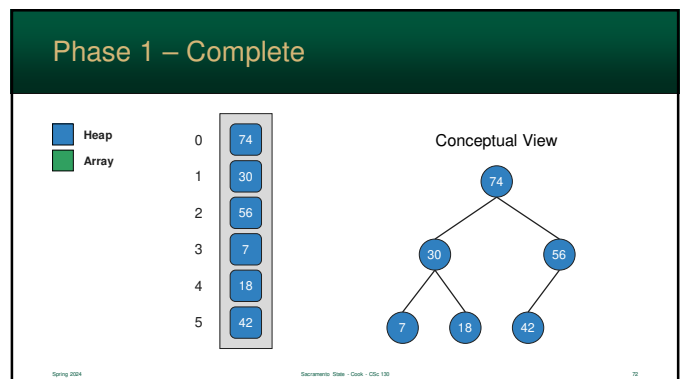
69



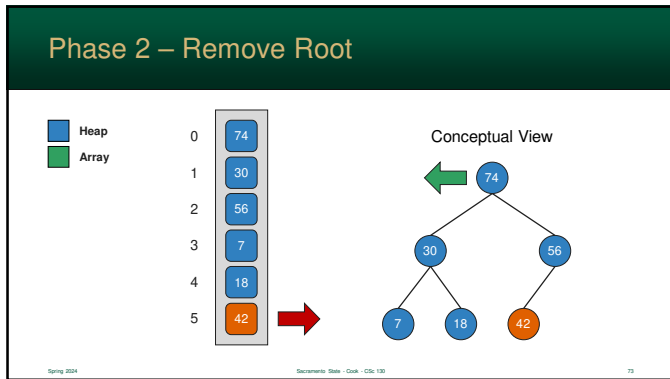
70



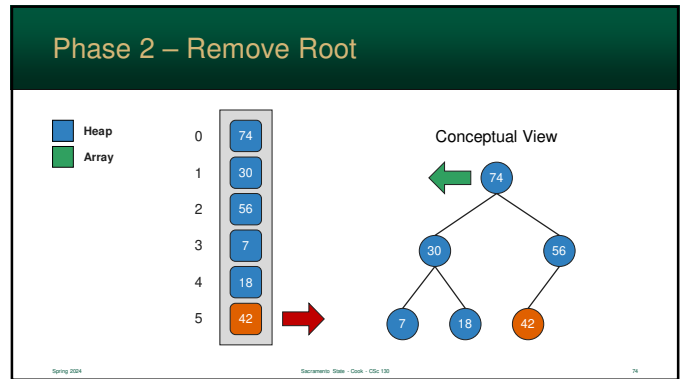
71



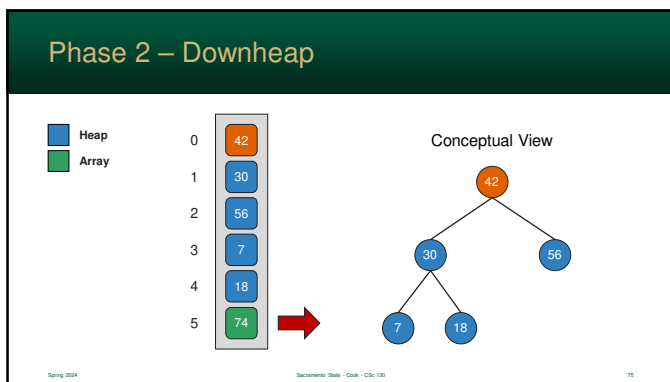
72



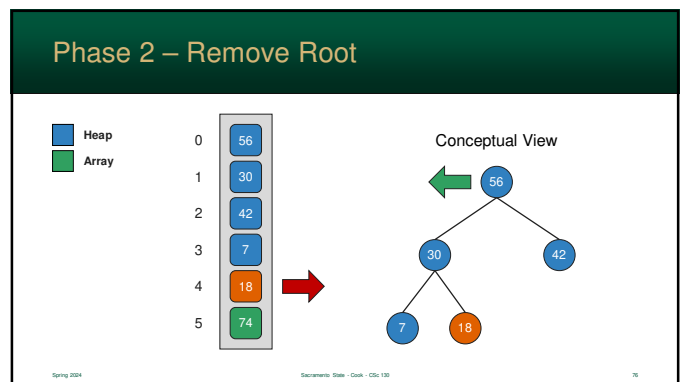
73



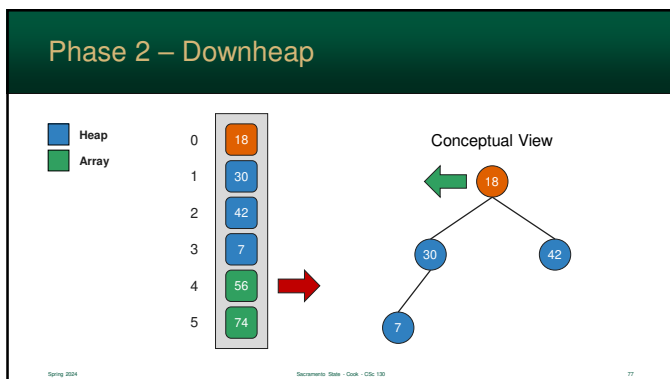
74



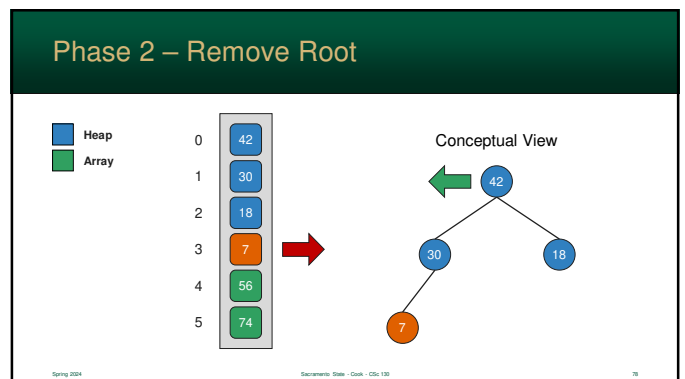
75



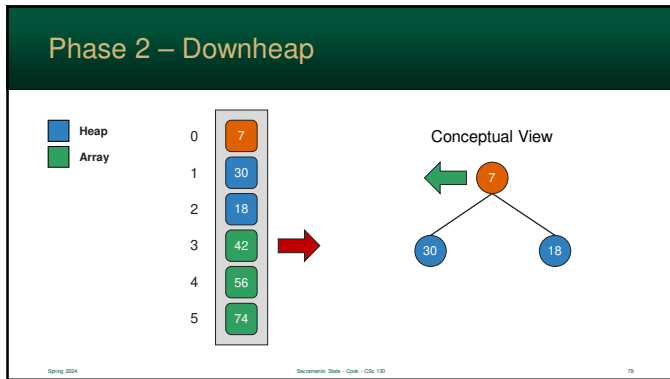
76



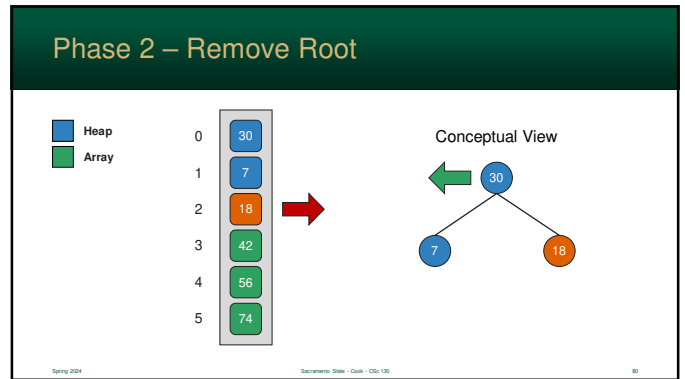
77



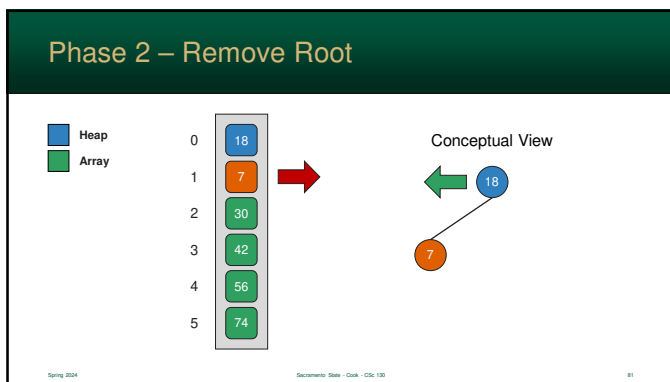
78



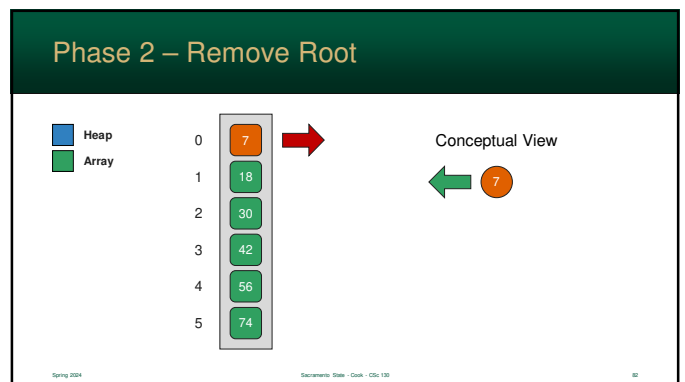
79



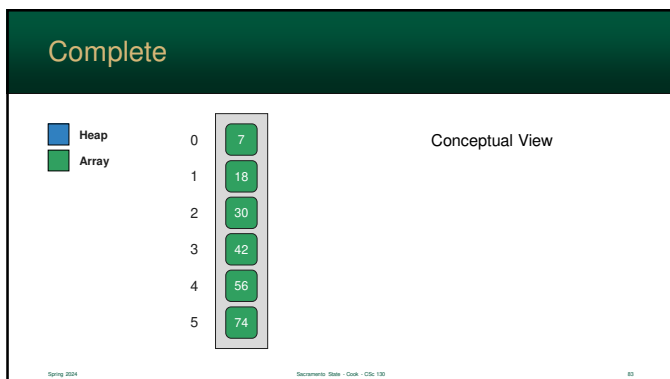
80



81



82



83

### 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  $O(n^2)$

Spring 2024 Sacramento State - CS&E - CS&E 130 84

84

## 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

Spring 2024

Sacramento State - CS&E - CS101-102

85

85

## 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                                     |

Spring 2024

Sacramento State - CS&E - CS101-102

86

86

## Summary of Sorting Algorithms

| Sort Algorithm | Best            | Average              | Worst                | Aux. Storage    |
|----------------|-----------------|----------------------|----------------------|-----------------|
| Bubble         | $O(n^2)$        | $O(n^2)$             | $O(n^2)$             | $O(1)$          |
| Selection      | $O(n^2)$        | $O(n^2)$             | $O(n^2)$             | $O(1)$          |
| Insertion      | $O(n)$          | $O(n^2)$             | $O(n^2)$             | $O(1)$          |
| Shell          | $O(n \log n)$   | $O(n^{\frac{3}{2}})$ | $O(n^{\frac{3}{2}})$ | $O(1)$          |
| Merge          | $O(n \log n)$   | $O(n \log n)$        | $O(n \log n)$        | $O(n)$          |
| Quick          | $O(n \log n)$   | $O(n \log n)$        | $O(n^2)$             | $O(1)$          |
| Heap           | $O(n \log n)$   | $O(n \log n)$        | $O(n \log n)$        | $O(1)$          |
| Radix          | $O(k \times n)$ | $O(k \times n)$      | $O(k \times n)$      | $O(b \times n)$ |

Spring 2024

Sacramento State - CS&E - CS101-102

87

87