

# CSC230

# Outline

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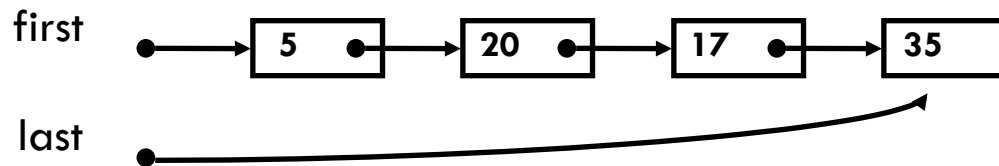
- Priority Queue

- Heap

# Stacks and Queues as Lists

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- Stack (LIFO) implemented as list
  - **push()**, **pop()** from front of list
- Queue (FIFO) implemented as list
  - **push()** on back of list, **pop()** from front of list
- All operations are?
  - $O(1)$



# Priority Queue

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- Data items are **Comparable**
- *Each* element has *its* priority
- **pop()** returns the element with the highest priority
- break ties arbitrarily

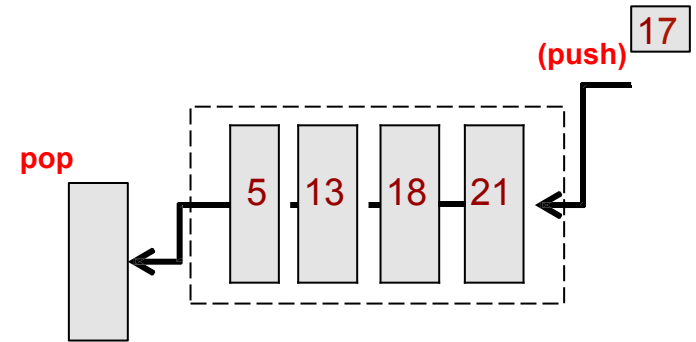
# Priority Queue Examples

- Scheduling jobs to run on a computer
  - default priority = arrival time
  - priority can be changed by operator
- Scheduling events to be processed by an event handler
  - priority = time of occurrence
- Airline check-in
  - first class, business class, coach
  - FIFO within each class

# Difference between Queue and Priority Queue

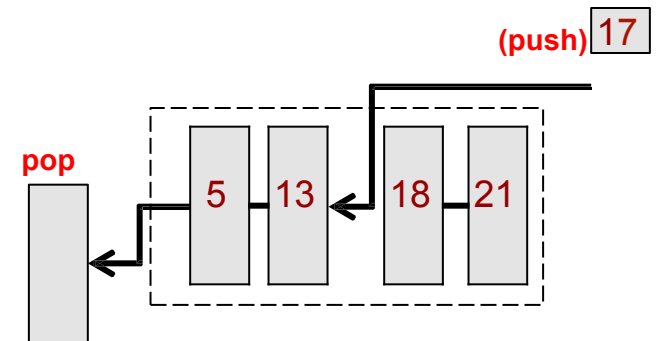
6

- **Traditional Queue:**
  - Push to the back
  - Pop from the front
  - Push/Pop do not care about the values



Traditional Queue

- **Priority Queue:**
  - Data are ordered
    - Increasing or decreasing
    - Hospital ER service
  - Items can arrive in arbitrary order
  - When remove an item, we always get the minimum or maximum depending on the implementation



Priority Queue

# STL Priority Queue

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- Decreasing-order by default
- Methods:
  - push(new\_item)
  - pop(): removes
  - top() return top item
  - size()
  - empty()

```
// priority_queue::push/pop
#include <iostream>
#include <queue>

using namespace std;

int main ()
{
    priority_queue<int> myPQ;
    myPQ.push(10);
    myPQ.push(80);
    myPQ.push(15);
    myPQ.push(30);
    cout << "Popping out elements...";
    while (!myPQ.empty()) {
        cout << myPQ.top() << endl;
        myPQ.pop();
    }
    return 0;
}
```

# How about increasing order?

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```
// priority_queue::push/pop
#include <iostream>
#include <queue>
using namespace std;
int main ()
{
    priority_queue<int,vector<int>,greater<int> > myPQ;
    myPQ.push(30);
    myPQ.push(100);
    myPQ.push(25);
    cout<< "Popping out elements..." << endl;
    while (!myPQ.empty()) {
        cout << myPQ.top() << endl;
        myPQ.pop();
    }
}
```

Data type of  
inserted data

Data type used  
by priority  
queue to store  
data

Increasing order  
(**less** denotes  
decreasing  
order)



# List-based Priority Queue

- Unsorted list implementation

- Store the items of the priority queue in a list-based sequence, in arbitrary order



- Performance:

- **insertItem** takes  $O(1)$  time since we can insert the item at the beginning or end of the sequence
- **removeMin**, **minKey** and **minElement** take  $O(n)$  time since we have to traverse the entire sequence to find the smallest key

- sorted list implementation

- Store the items of the priority queue in a sequence, sorted by key



- Performance:

- **insertItem** takes  $O(n)$  time since we have to find the place where to insert the item
- **removeMin**, **minKey** and **minElement** take  $O(1)$  time since the smallest key is at the beginning of the sequence

# Priority Queues as Lists

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- Maintain as **unordered** list
  - **push()** puts new element at front ?
    - $O(1)$
  - **pop()** must **search** the list ?
    - $O(n)$
- Maintain as **ordered** list
  - **push()** must **search** the list ?
    - $O(n)$
  - **pop()** gets element at front ?
    - $O(1)$
- In either case,  $O(n^2)$  to process  $n$  elements

Can we do better?

# Important Special Case

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- Fixed number of priority levels  $0, \dots, p - 1$
- FIFO within each level
- Example: airline check-in
- **push()**— insert in appropriate queue —  $O(1)$
- **pop()**— must find a nonempty queue —  $O(p)$
- How to implement Priority Queue ?

# Heaps

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- A **heap** is a concrete data structure that can be used to implement priority queues
- Gives better complexity than either ordered or unordered list implementation:
  - **push()**:  $O(\log n)$
  - **pop()**:  $O(\log n)$
- $O(n \log n)$  to process  $n$  elements
- Do not confuse with **heap memory**, where C++ dynamically allocates space – different usage of the word **heap**

# Heaps

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- Binary tree with data at each node
- Satisfies the *Heap Order Invariant*:

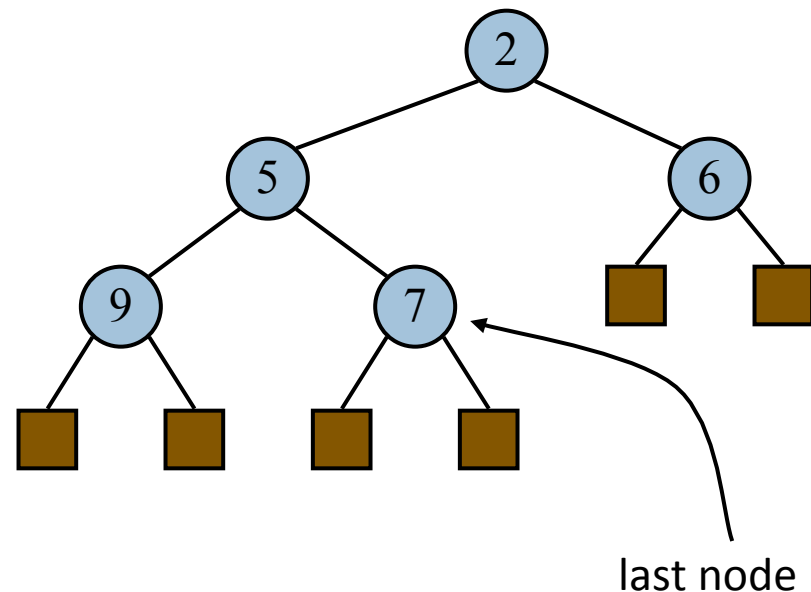
The **least** or **highest** priority element of any **subtree** is found at the **root** of that subtree

- Size of the heap is “fixed” at  $n$ . (But can usually double  $n$  if heap fills up)

# What is a heap?

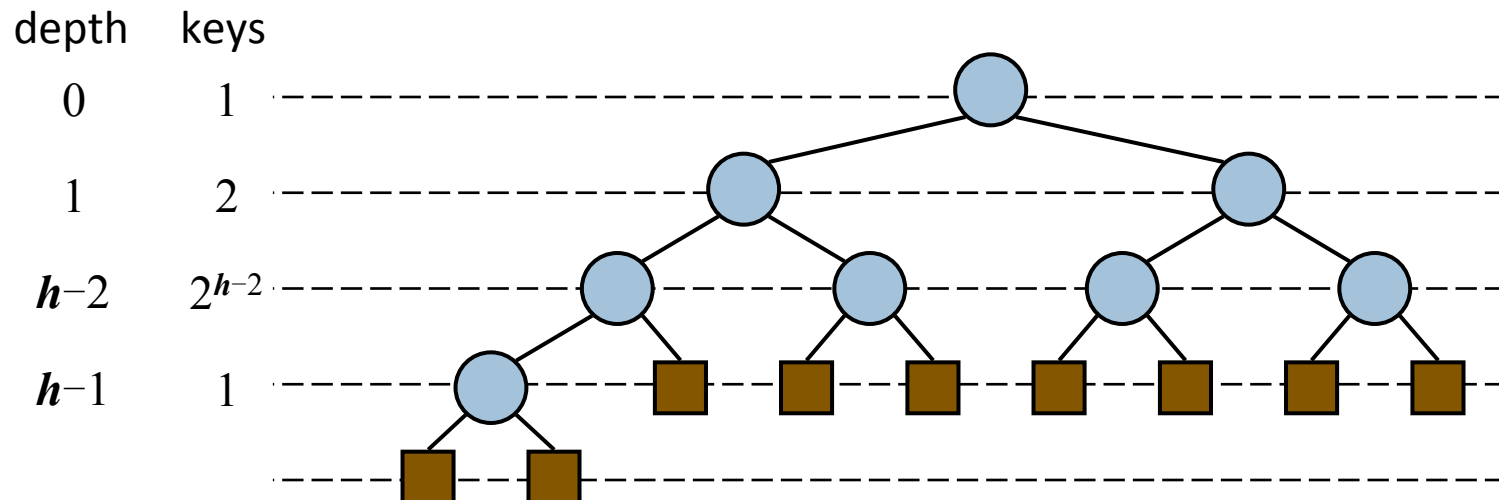
- A heap is a binary tree storing keys at its internal nodes and satisfying the following properties:
  - **Heap-Order:** for every internal node  $v$  other than the root,  $key(v) \geq key(parent(v))$
  - **Complete Binary Tree:** let  $h$  be the height of the heap
    - for  $i = 0, \dots, h - 1$ , there are  $2^i$  nodes of depth  $i$
    - at depth  $h - 1$ , the internal nodes are to the left of the leaf nodes

- The last node of a heap is the rightmost internal node of depth  $h - 1$



# Height of a Heap

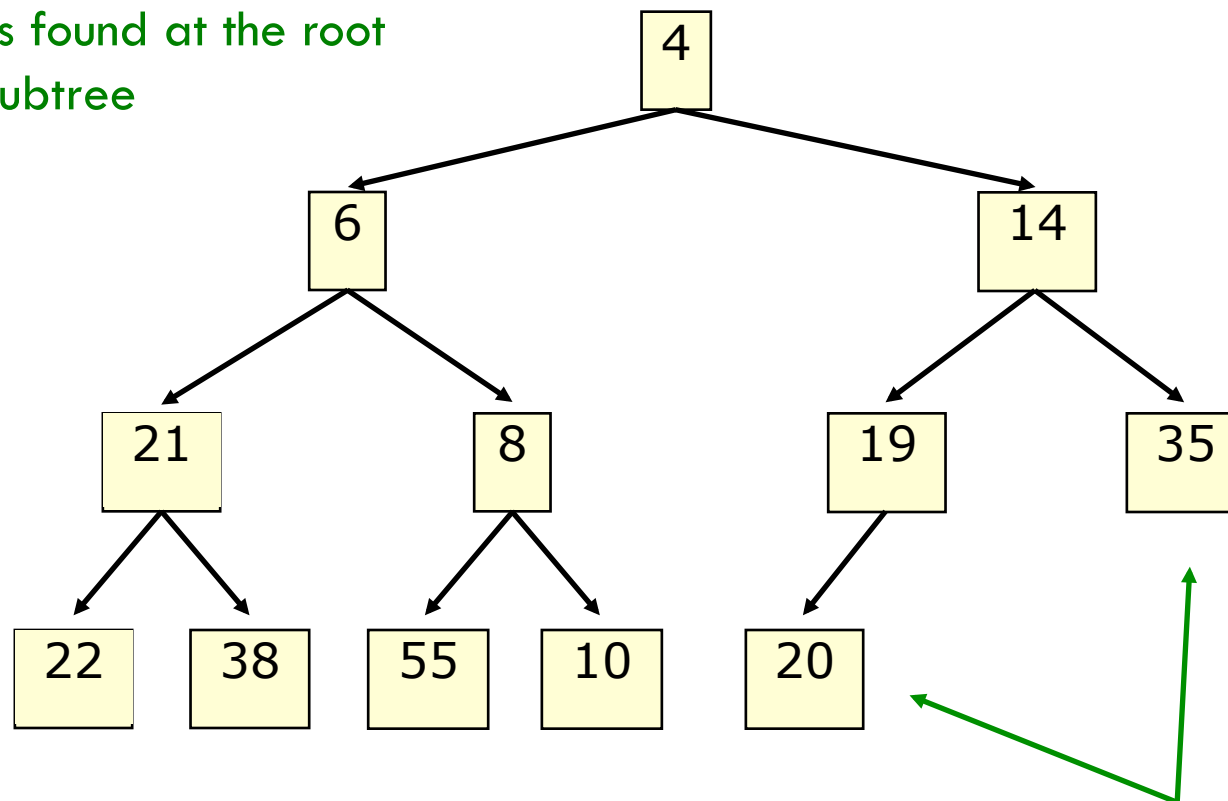
- **Theorem:** A heap storing  $n$  keys has height  $O(\log n)$
- **Proof:** (we apply the complete binary tree property)
  - Let  $h$  be the height of a heap storing  $n$  keys
  - Since there are  $2^i$  keys at depth  $i = 0, \dots, h-2$  and at least one key at depth  $h-1$ , we have  $n \geq 1 + 2 + 4 + \dots + 2^{h-2} + 1$
  - Thus,  $n \geq 2^{h-1}$ , i.e.,  $h \leq \log n + 1$



# Heaps

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Least element in any subtree  
is always found at the root  
of that subtree



Note:  $19, 20 < 35$ : we can often find  
smaller elements deeper in the tree!



# Examples of Heaps

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- Ages of people in family tree
  - parent is always older than children, but you can have an uncle who is younger than you (larger number will be on the root)
- Salaries of employees of a company
  - bosses generally make more than subordinates, but a VP in one subdivision may make less than a Project Supervisor in a different subdivision

# Balanced Heaps

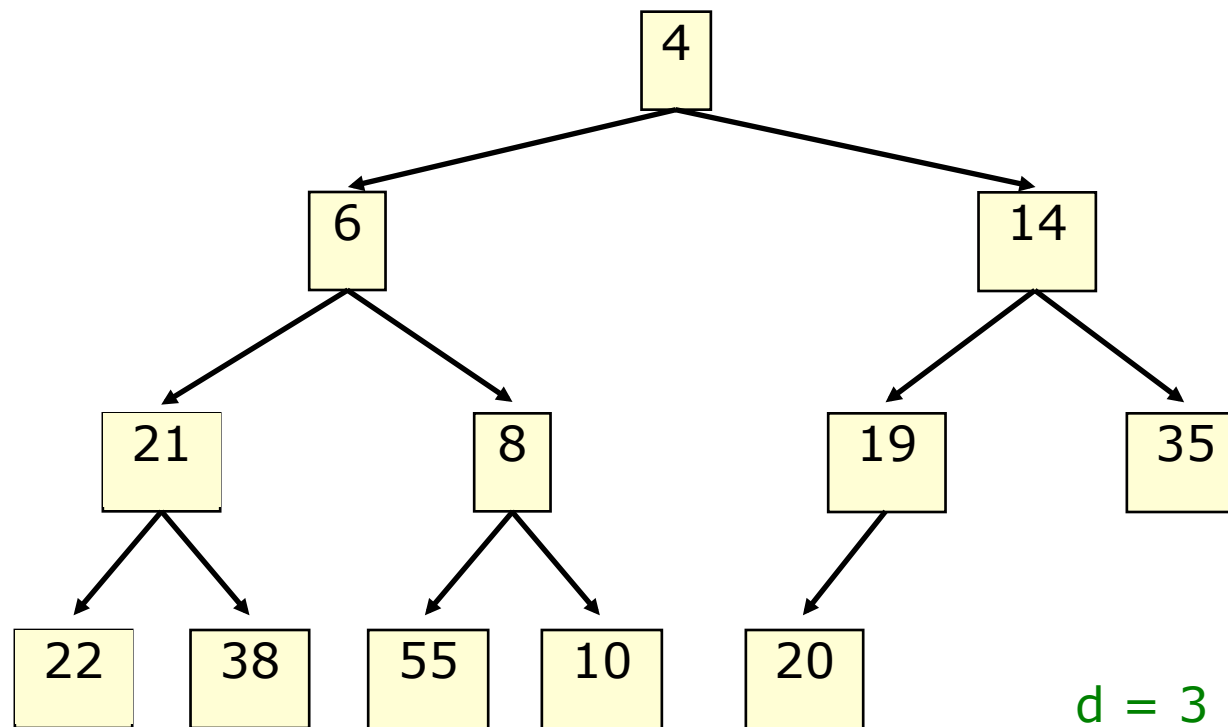
18

These add two restrictions:

1. Any node of depth  $< d - 1$  has **exactly** 2 children, where  $d$  is the height of the tree
  - implies that any two **maximal paths** (path from a root to a leaf) are of length  $d$  or  $d - 1$ , and the tree has at least  $2^d$  nodes
- All **maximal paths** of length  $d$  are to the **left** of those of length  $d - 1$

# Example of a Balanced Heap

19



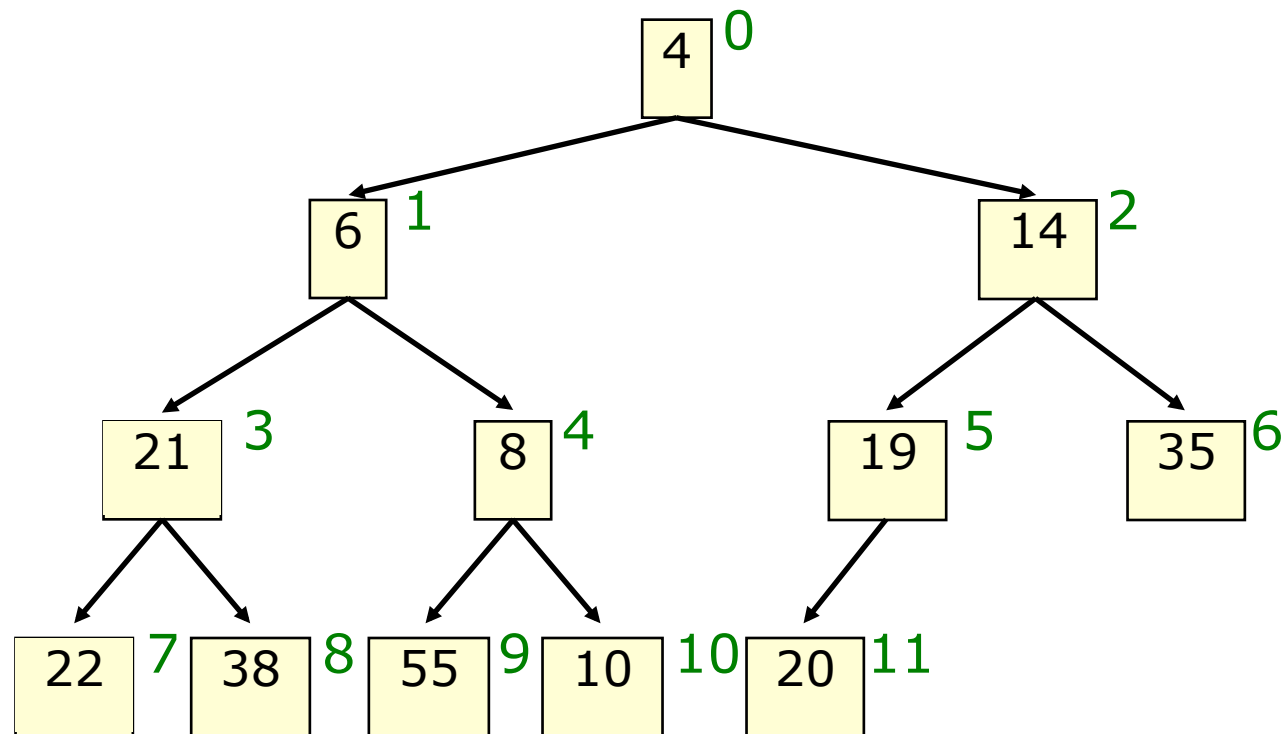
# Store in an Array or Vector

20

- Elements of the heap are stored in the array in order, going across each level from left to right, top to bottom
- The children of the node at array index  $n$  are found at  $2n + 1$  and  $2n + 2$
- The parent of node  $n$  is found at  $(n - 1)/2$

# Store in an Array or Vector

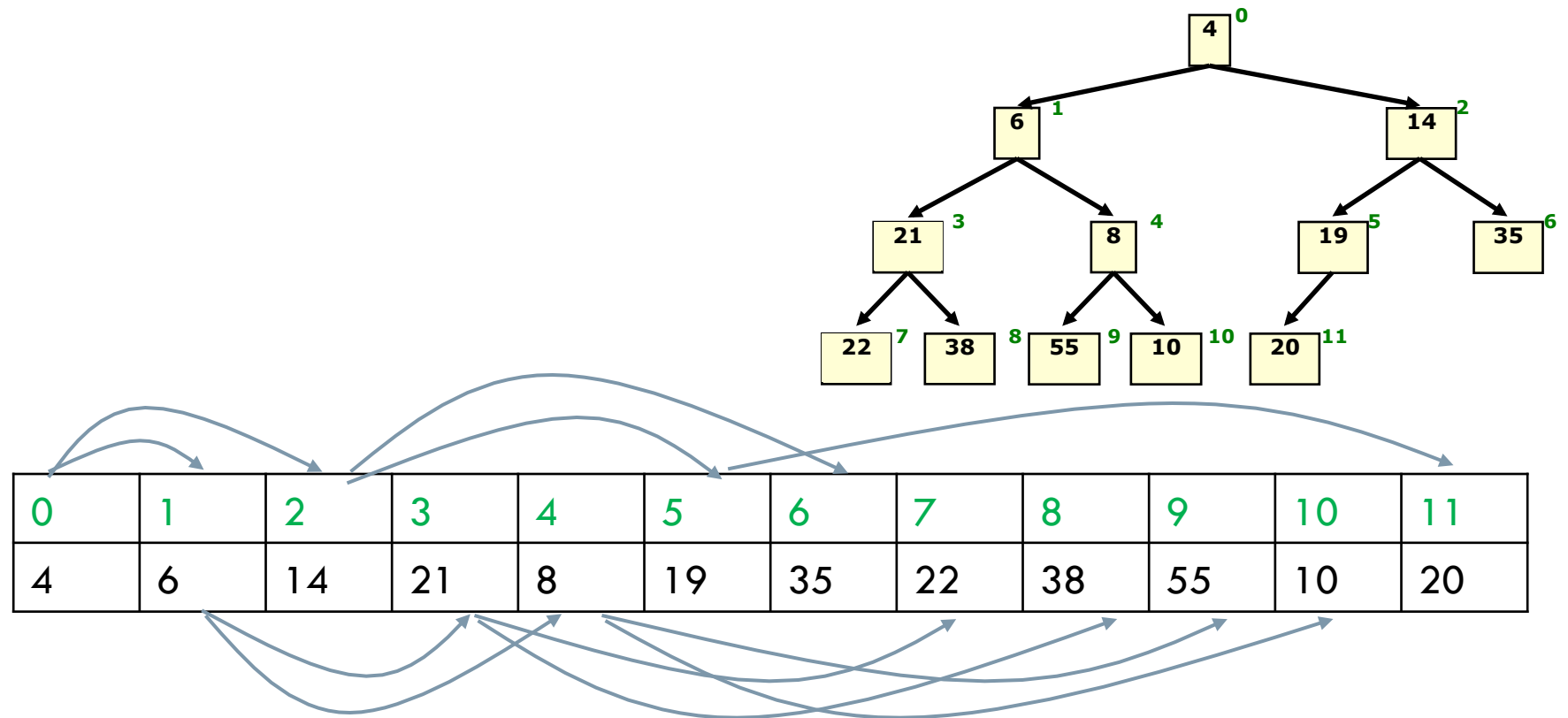
21



children of node  $n$  are found at  $2n + 1$  and  $2n + 2$

# Store in an Array or Vector

22



children of node  $n$  are found at  $2n + 1$  and  $2n + 2$

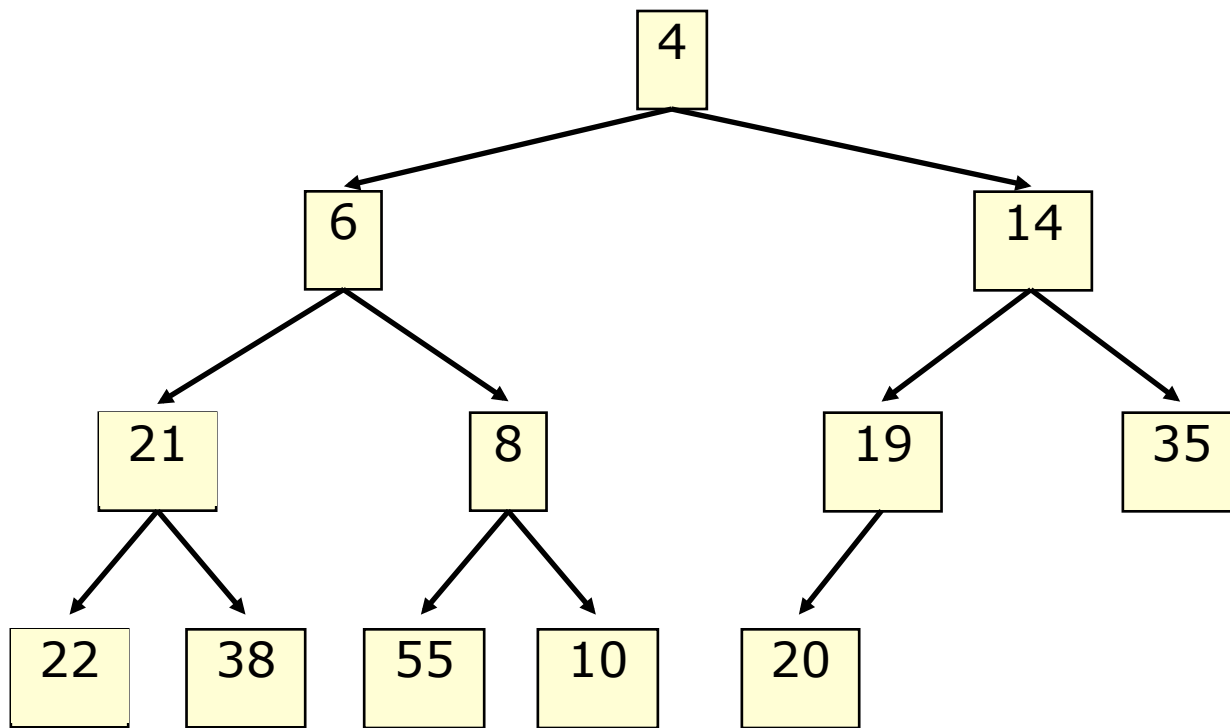
# push ()

23

- Put the new element at the **end** of the array
- If this violates heap order because it is smaller than its parent, swap it with its **parent**
- Continue swapping it up until it finds its rightful place
- The heap invariant is maintained!

# push ()

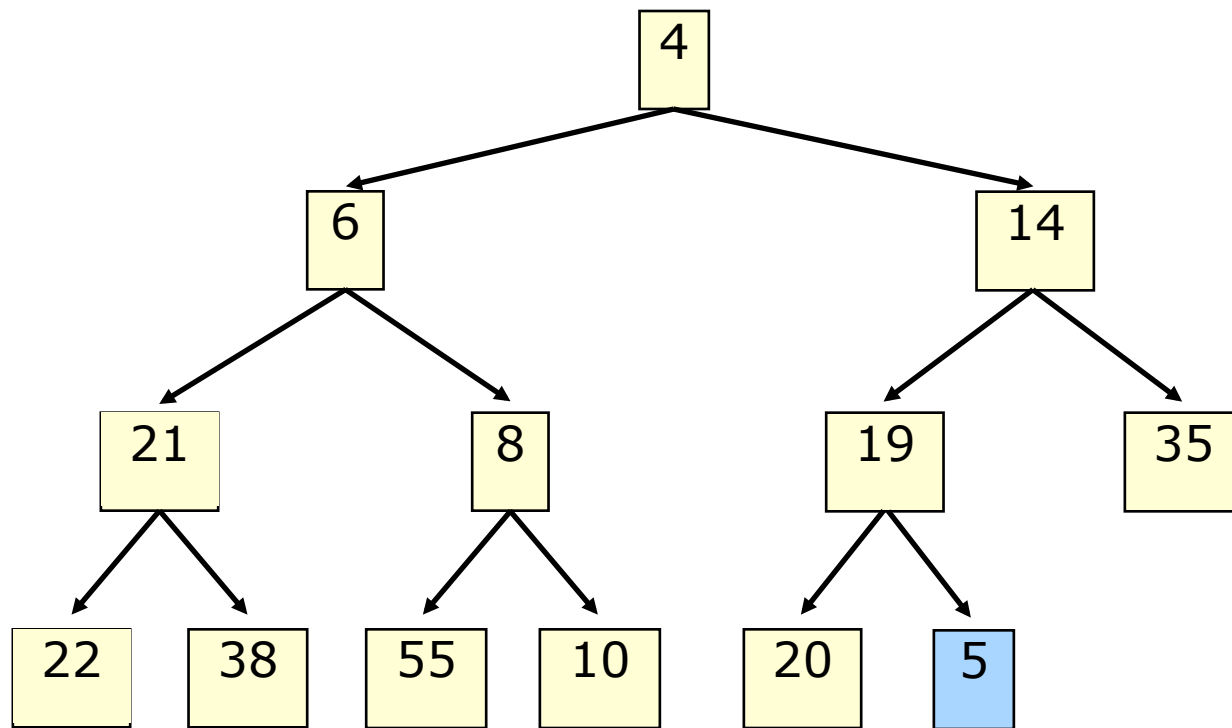
24





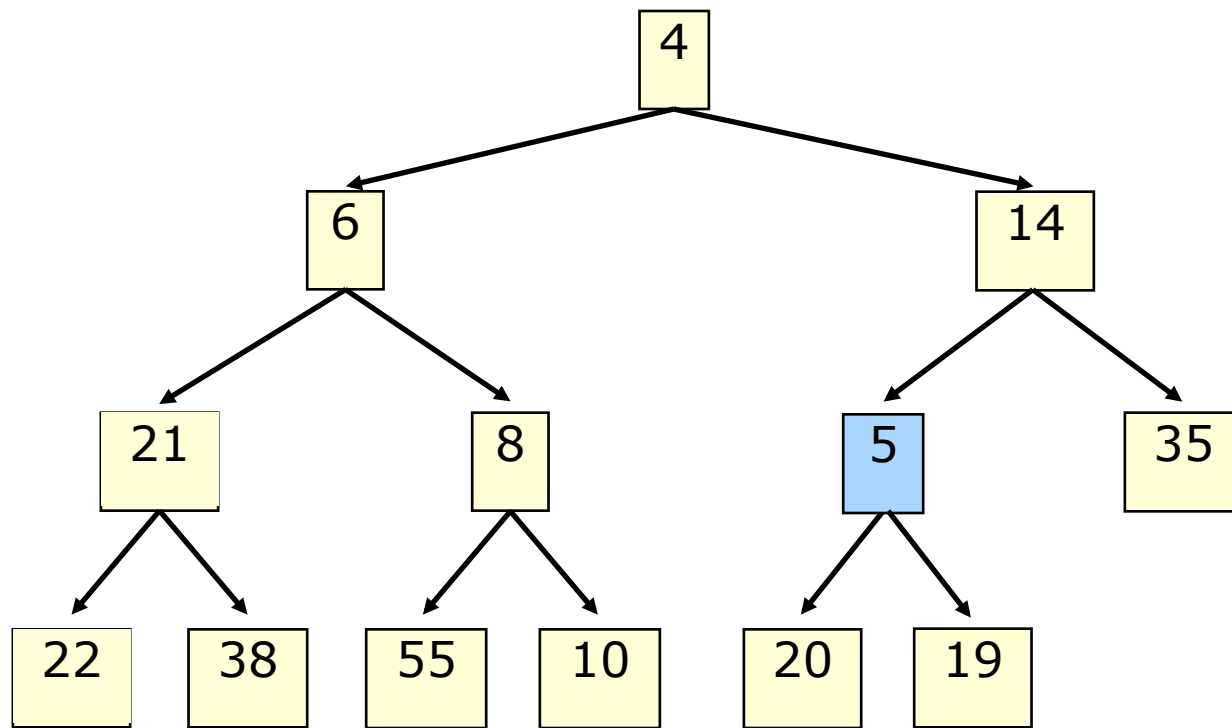
# push ()

25



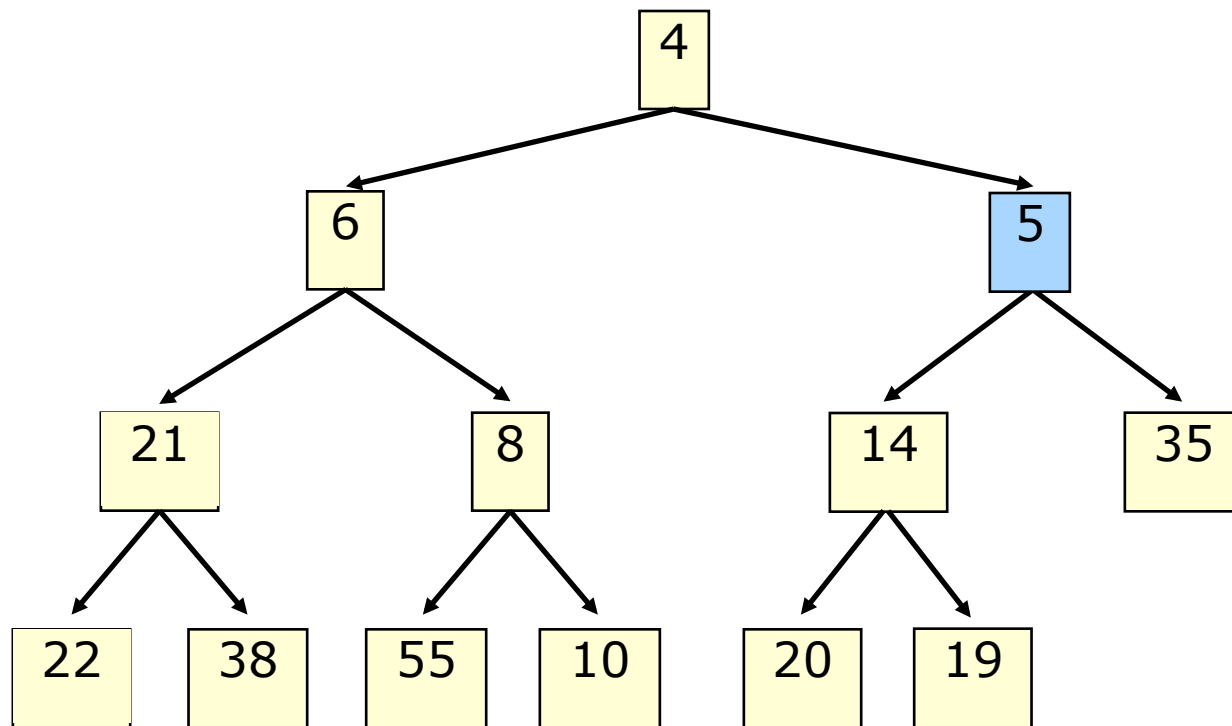
# push ()

26



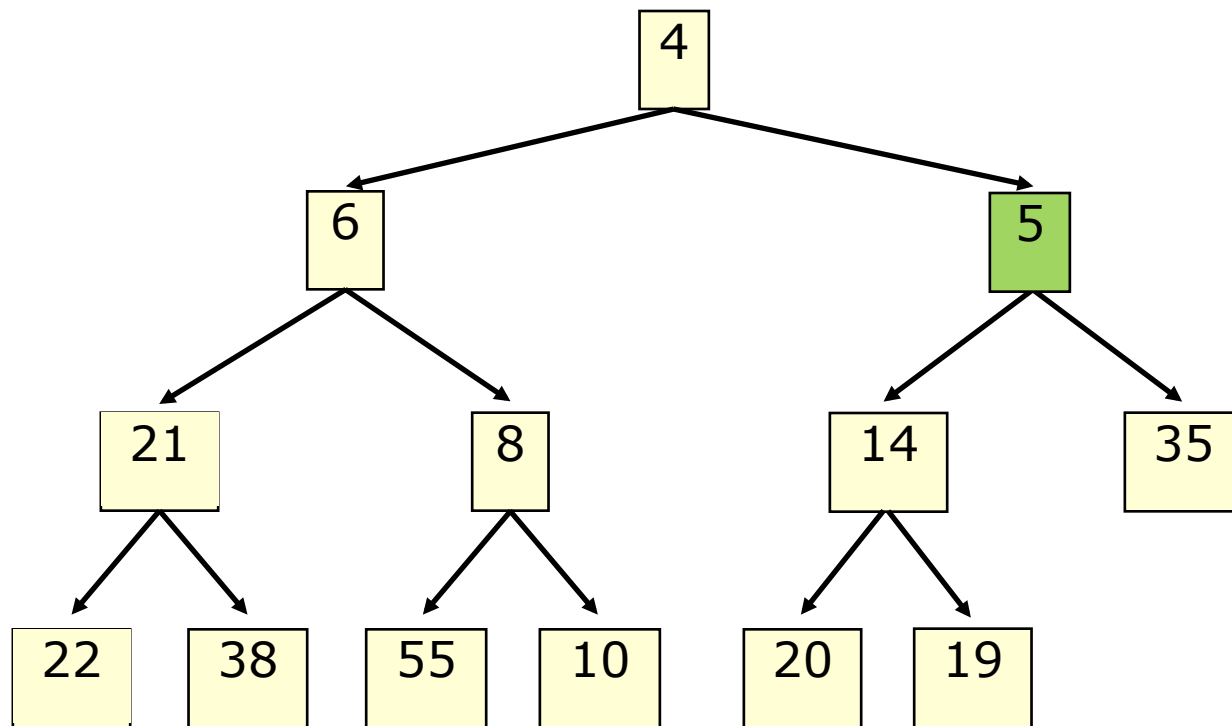
# push ()

27



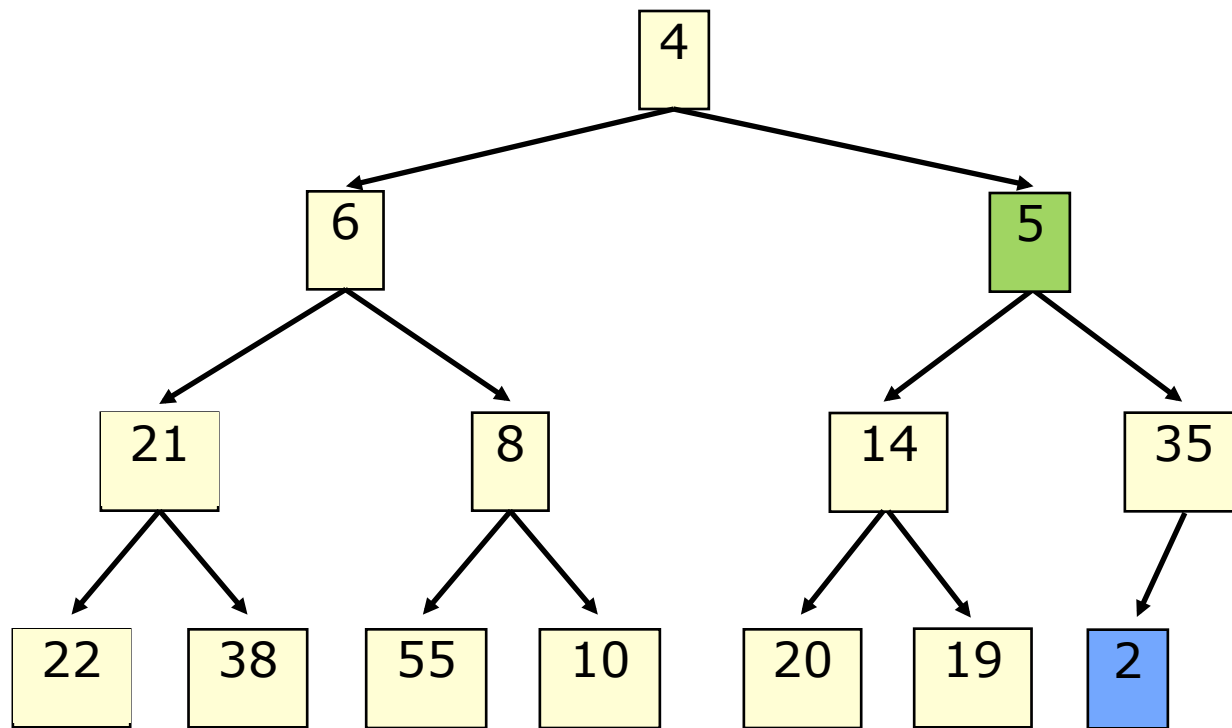
# push () (upheap)

28



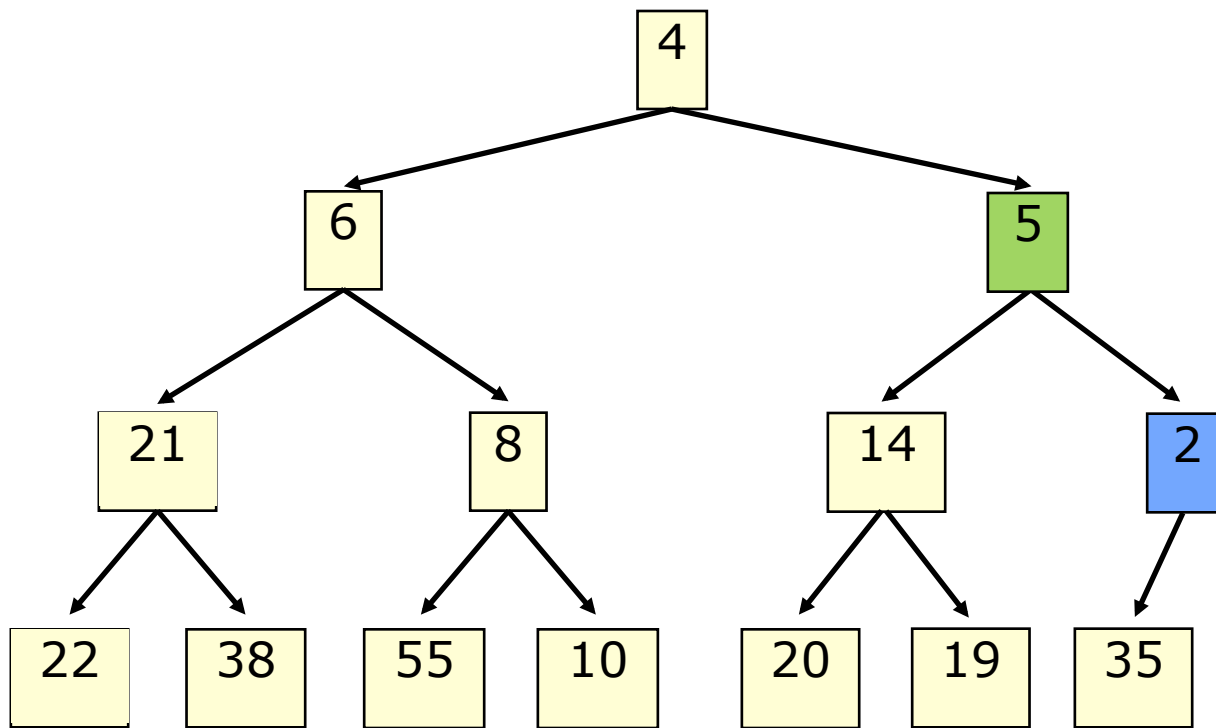
# push() (upheap)

29



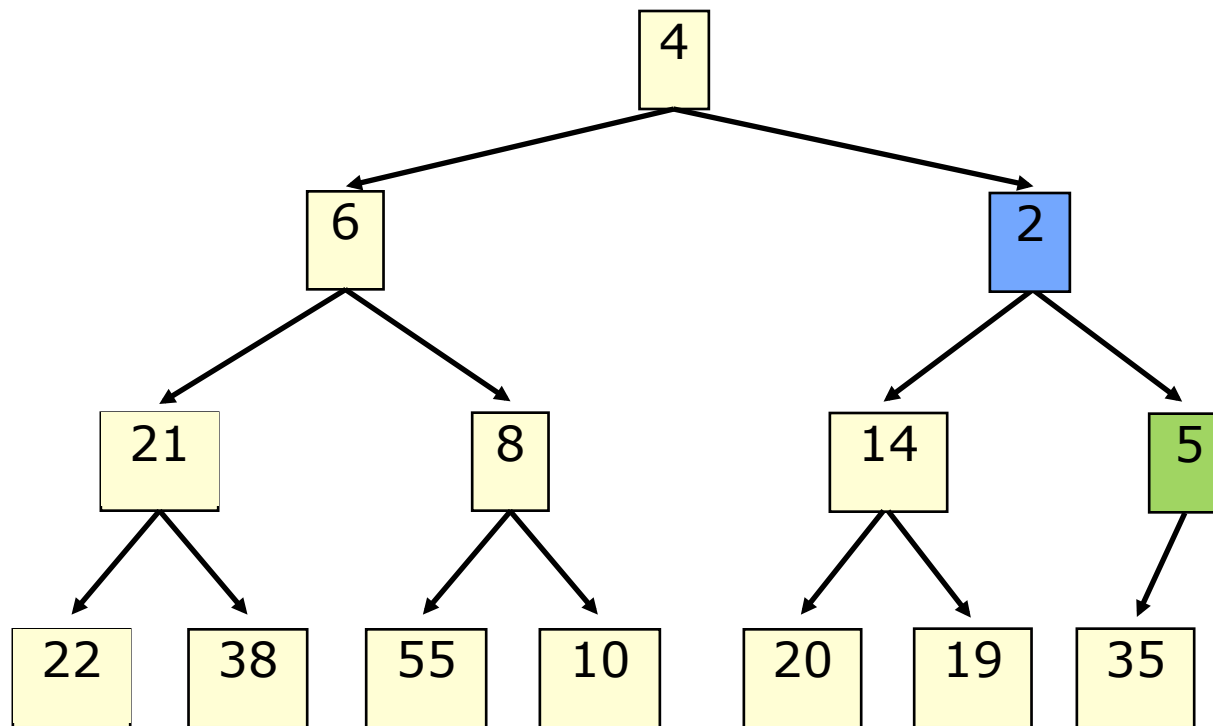
# push () (upheap)

30



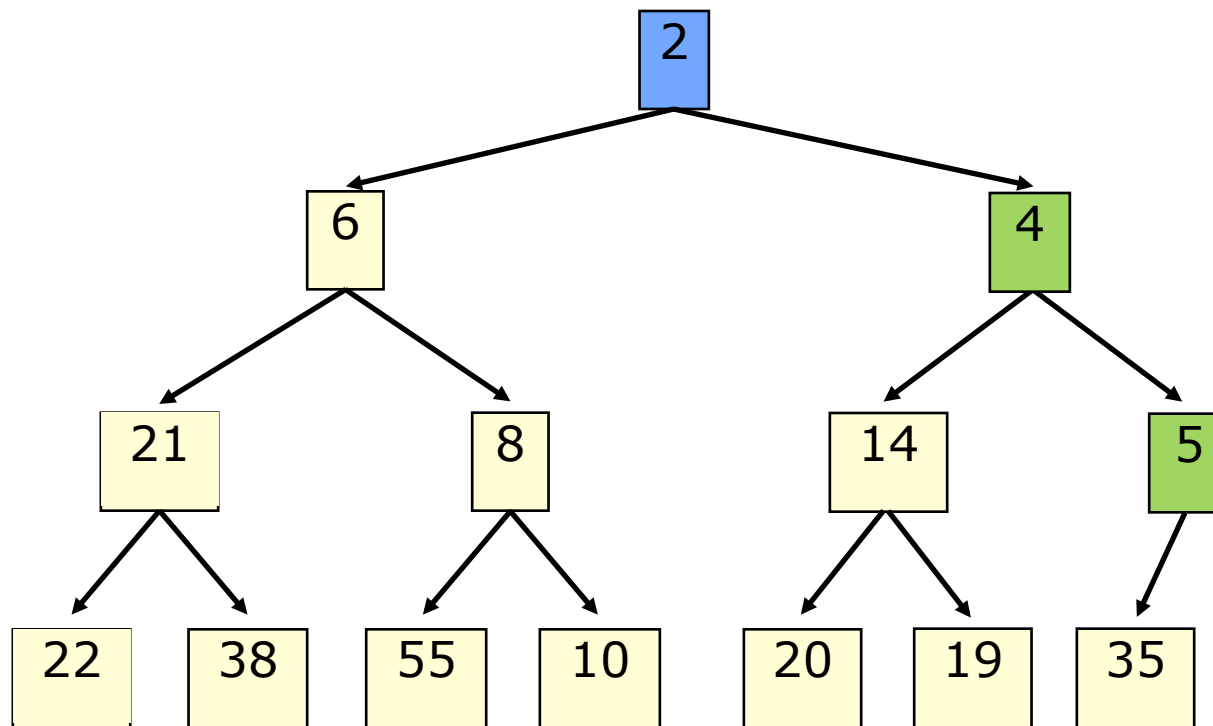
# push() (upheap)

31



# push() (upheap)

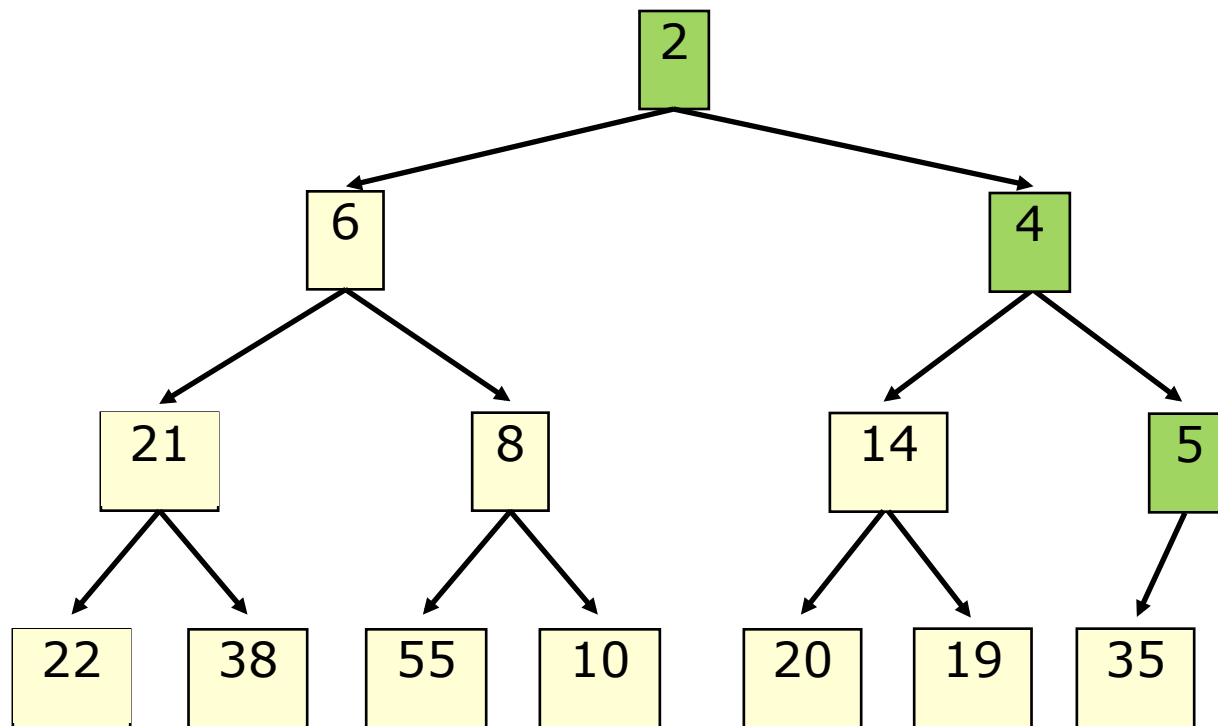
32





# push () (upheap)

33



# push () (upheap)

34

- Time is  $O(\log n)$ , since the tree is balanced
  - size of tree is exponential as a function of depth
  - depth of tree is logarithmic as a function of size

# push ()

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```
void ArrayMinHeap<T>::push(const T& item)
{
    items_.push(item); rotateUp(items_.size()-1);
}

void rotateUp(int loc)
{
    // could be implemented recursively
    int parent = loc/2;
    while(parent >= 1 &&
        items_[loc] < items_[parent] )
    {
        swap(items_[parent], items_[loc]);
        loc = parent;
        parent = loc/2;
    }
}
```

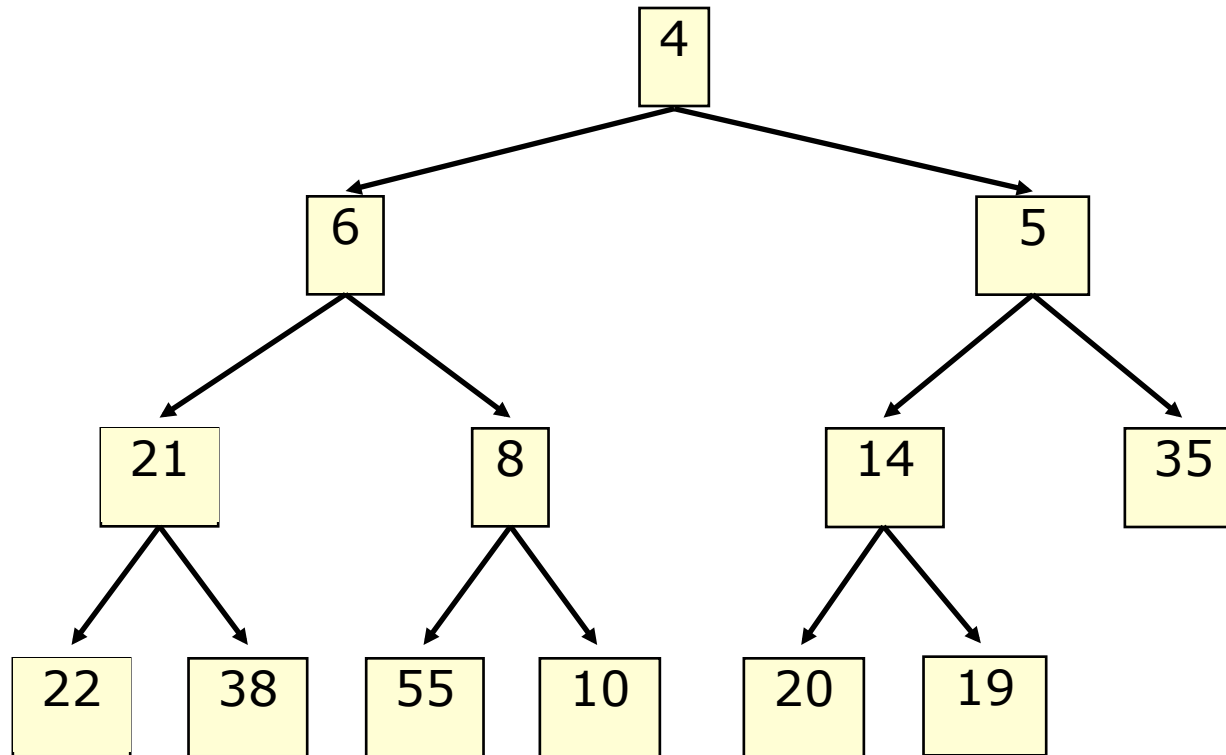
# pop () (downheap)

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- Remove the **least** element – it is at the **root**
- This leaves a hole at the root – fill it in with the **last element** of the array
- If this violates heap order because the root element is too big, **swap it down** with the smaller of its children
- Continue swapping it down until it finds its rightful place
- The heap invariant is maintained!

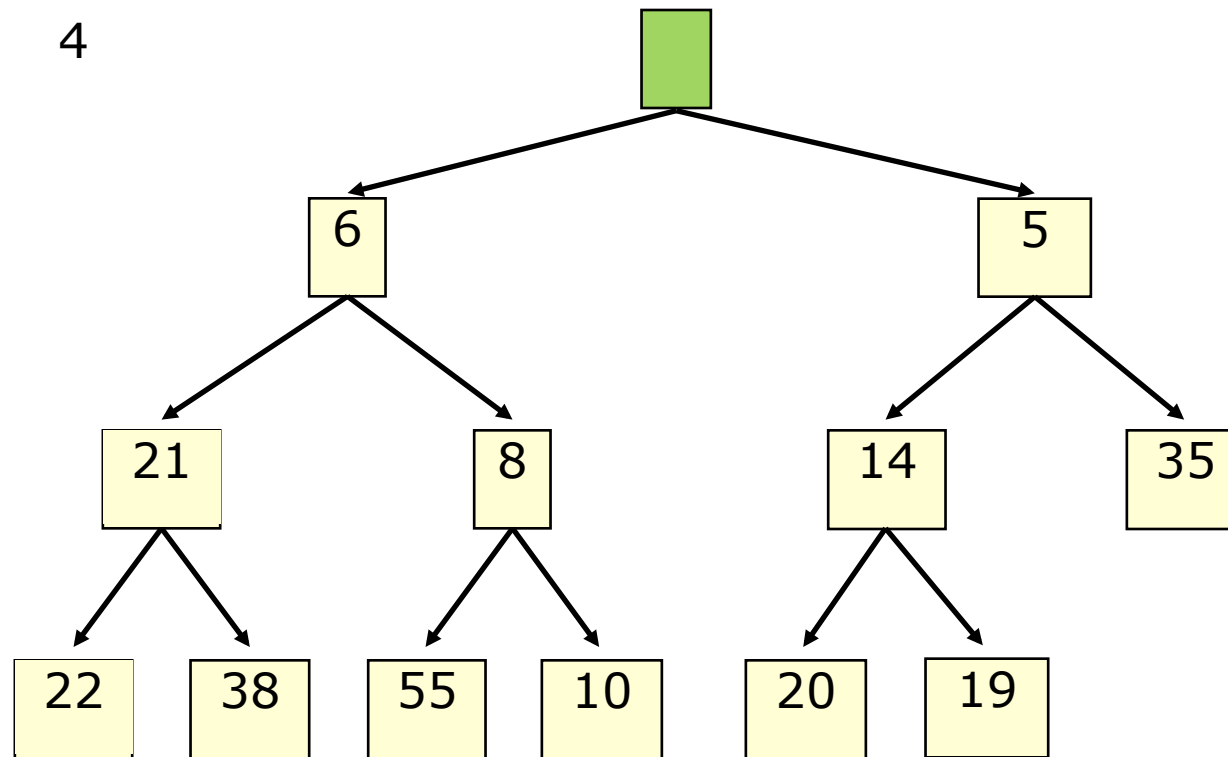
# pop() (downheap)

37



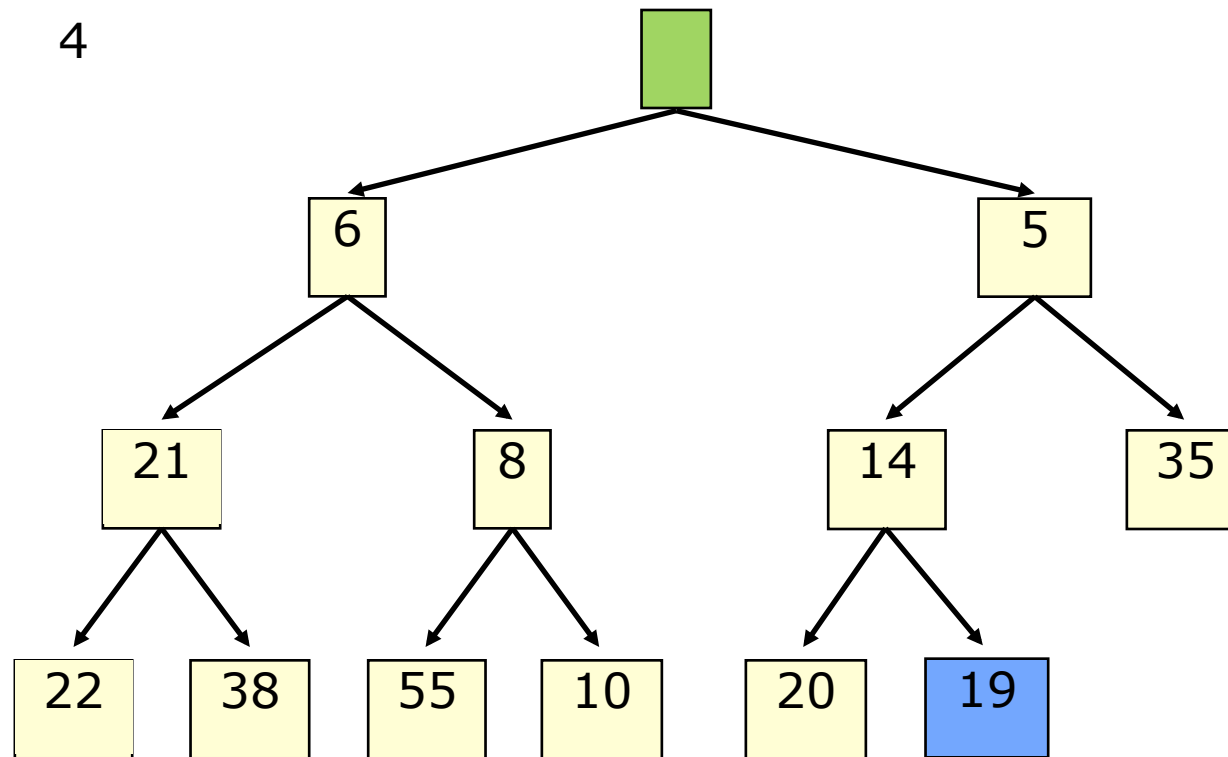
# pop() (downheap)

38



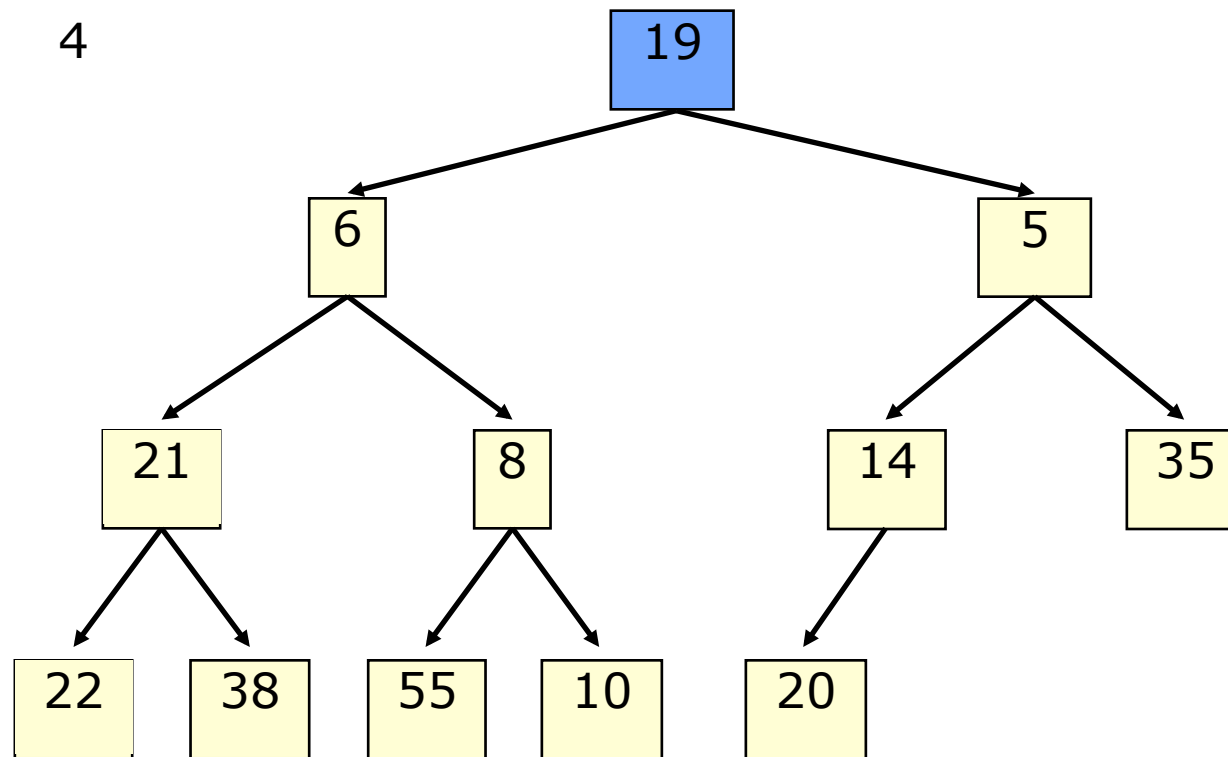
# pop() (downheap)

39



# pop() (downheap)

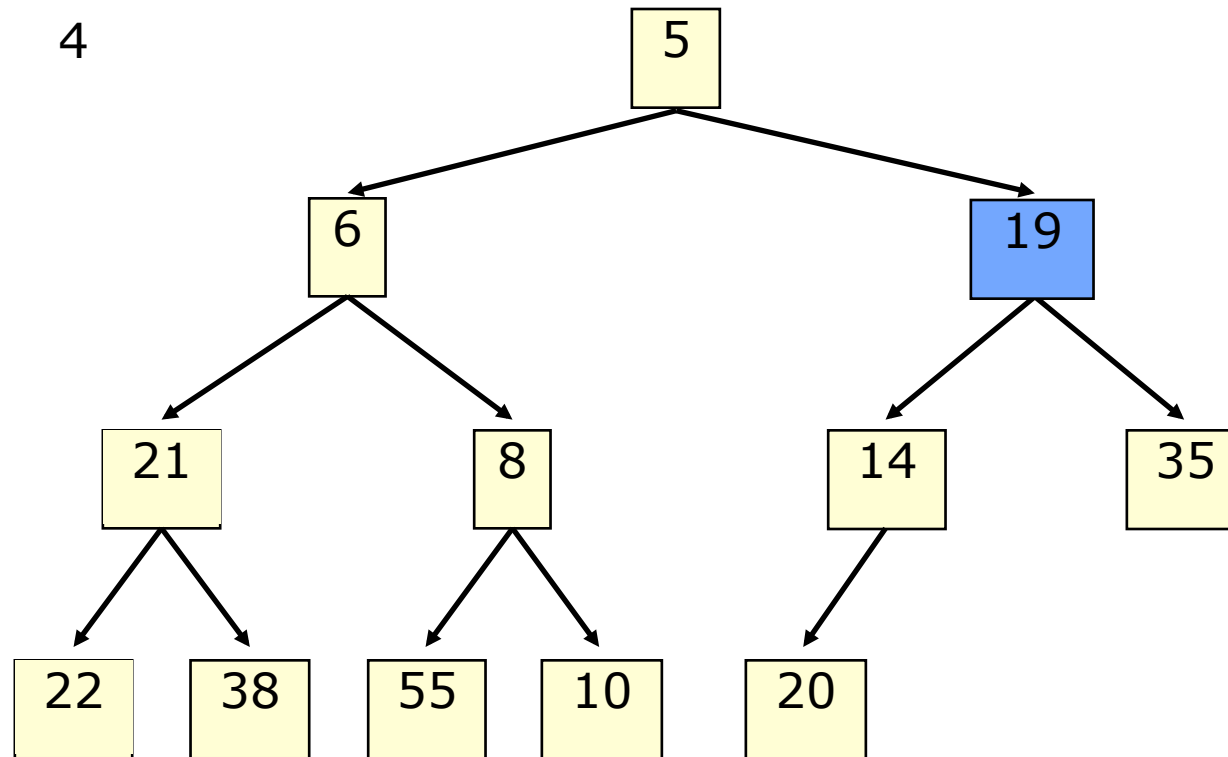
40





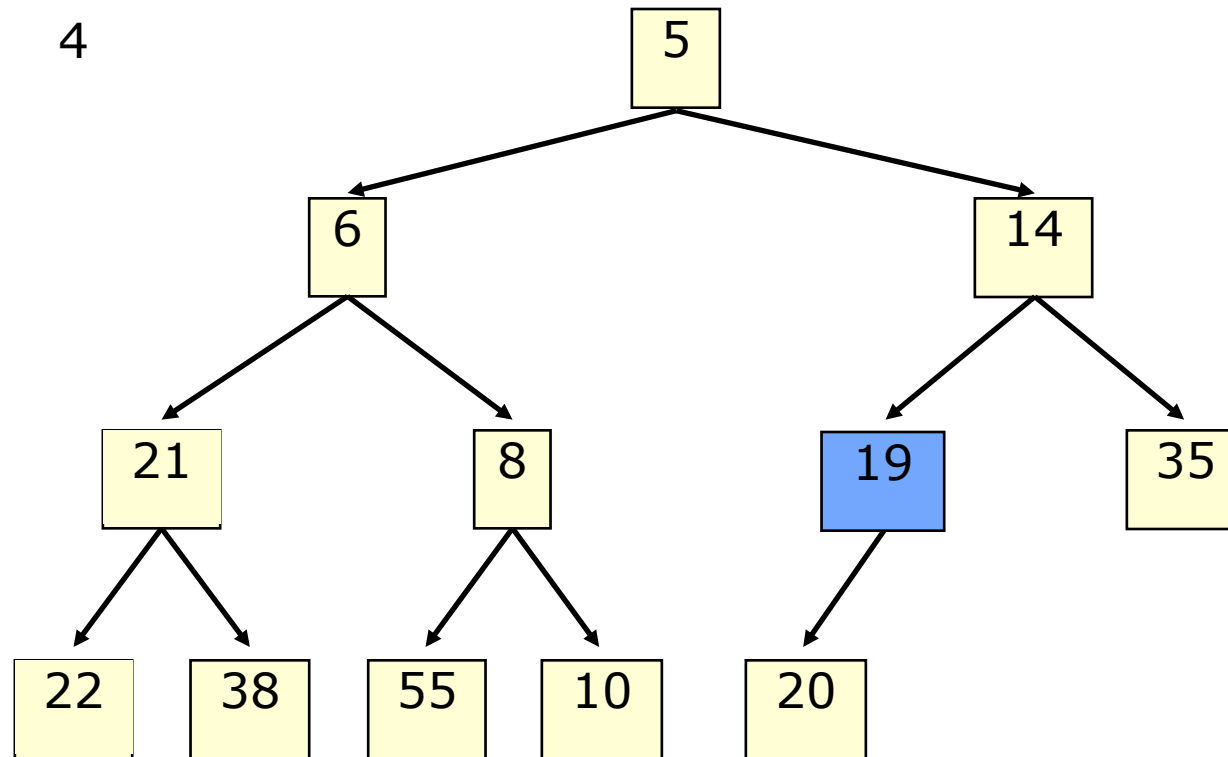
# pop() (downheap)

41



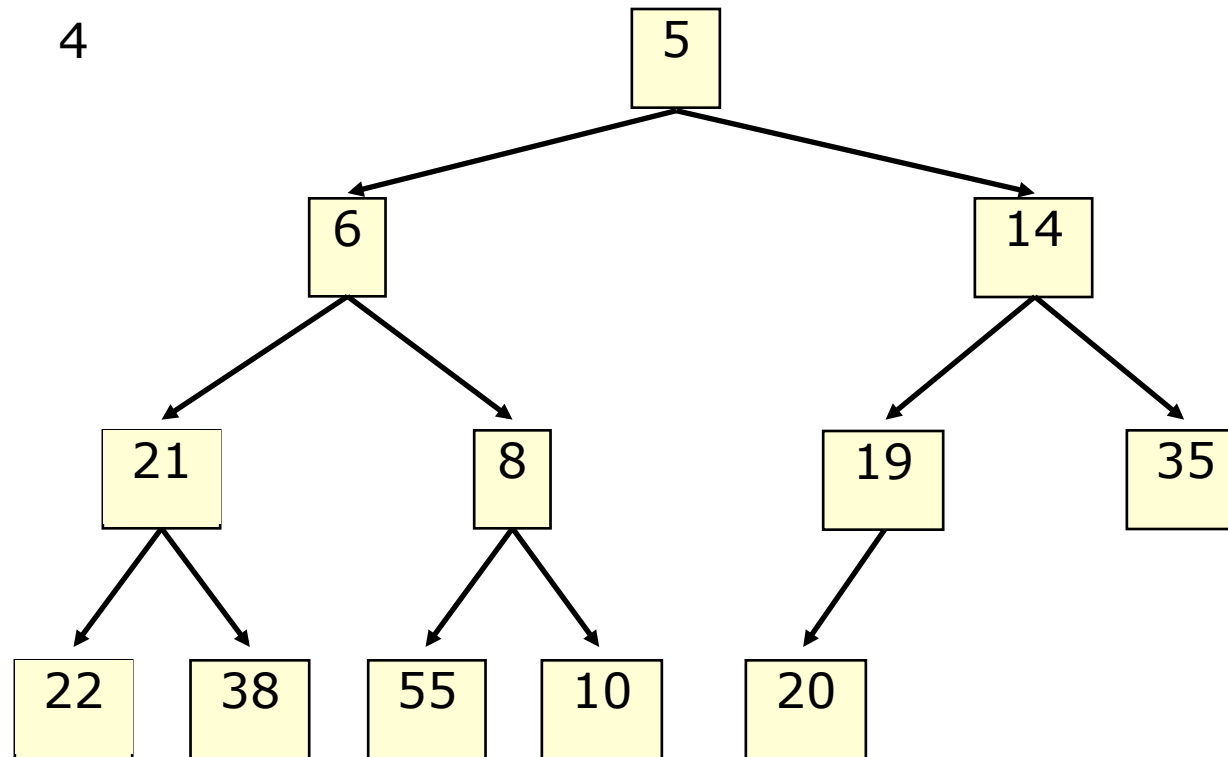
# pop() (downheap)

42



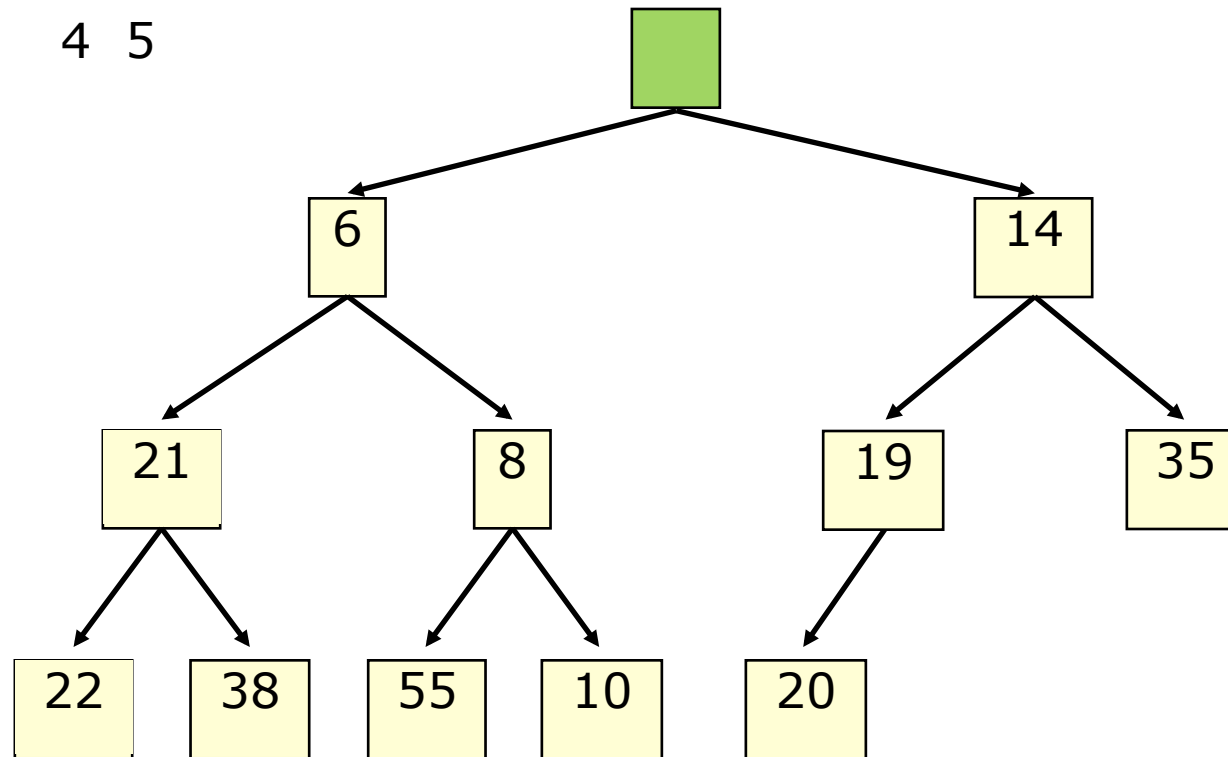
# pop() (downheap)

43



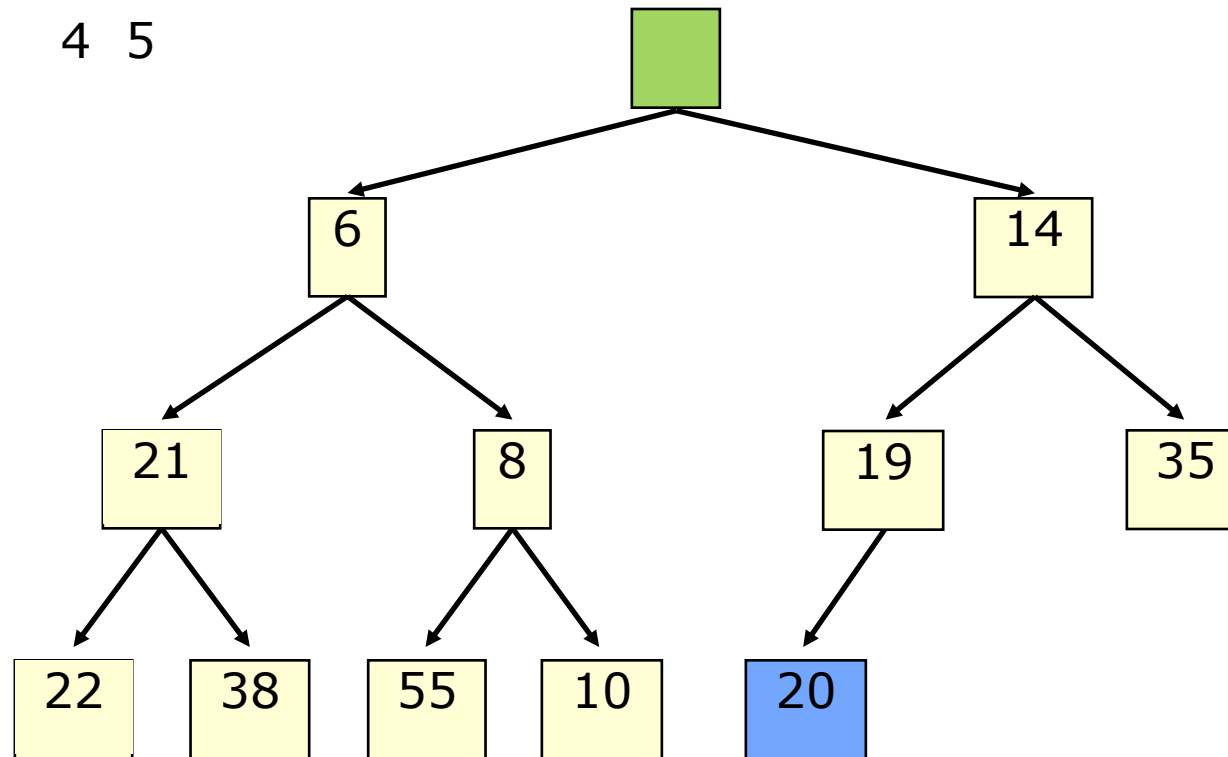
# pop() (downheap)

44



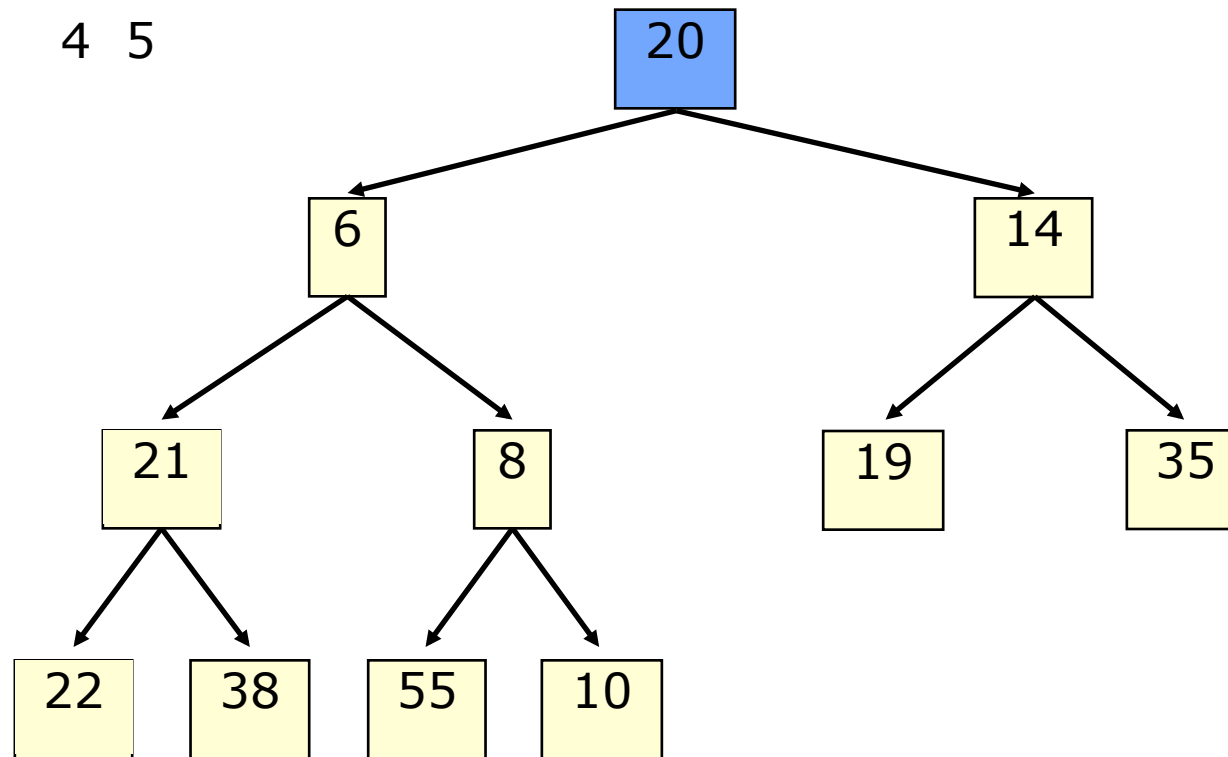
# pop() (downheap)

45



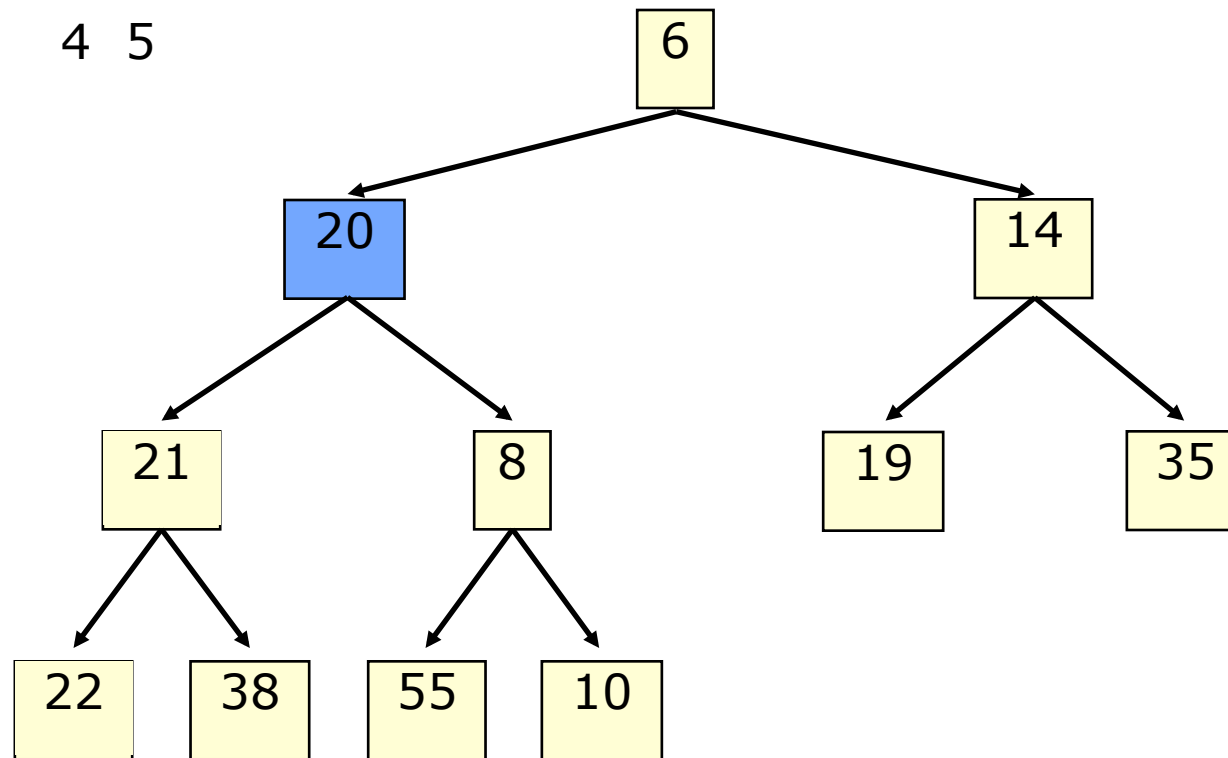
# pop() (downheap)

46



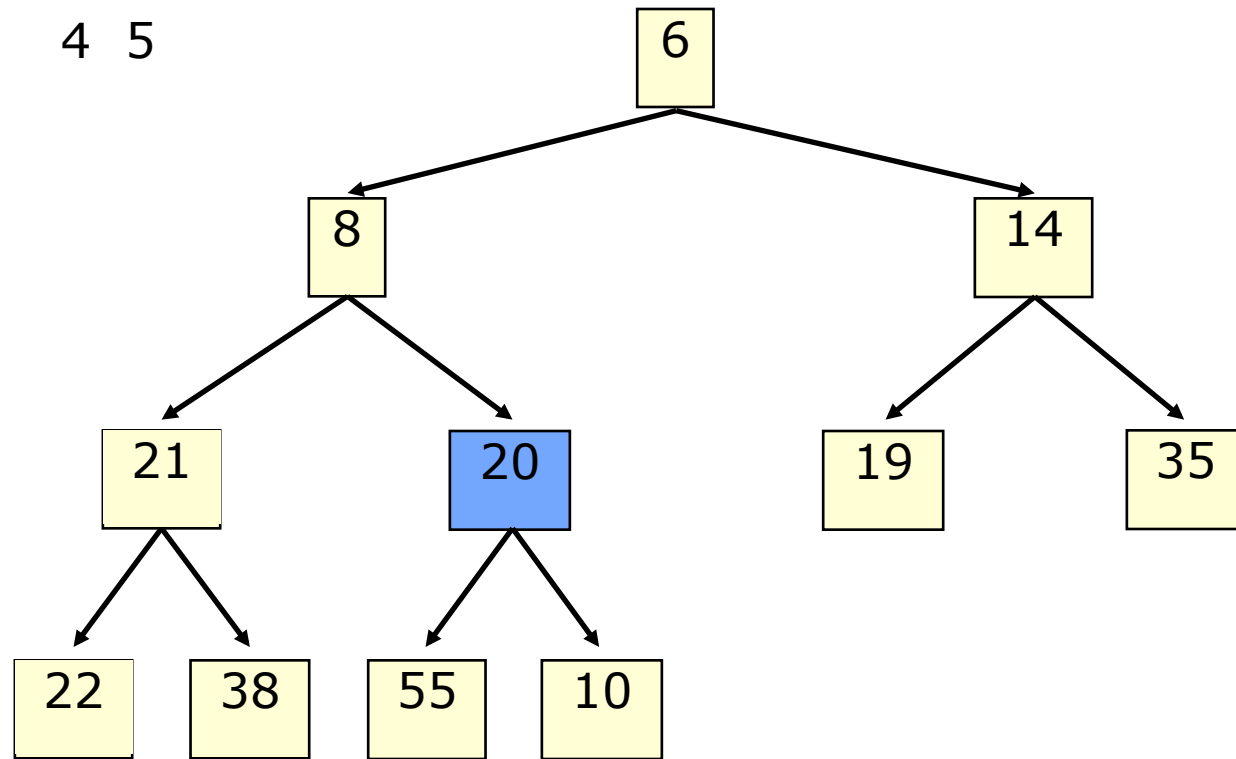
# pop() (downheap)

47



# pop ()

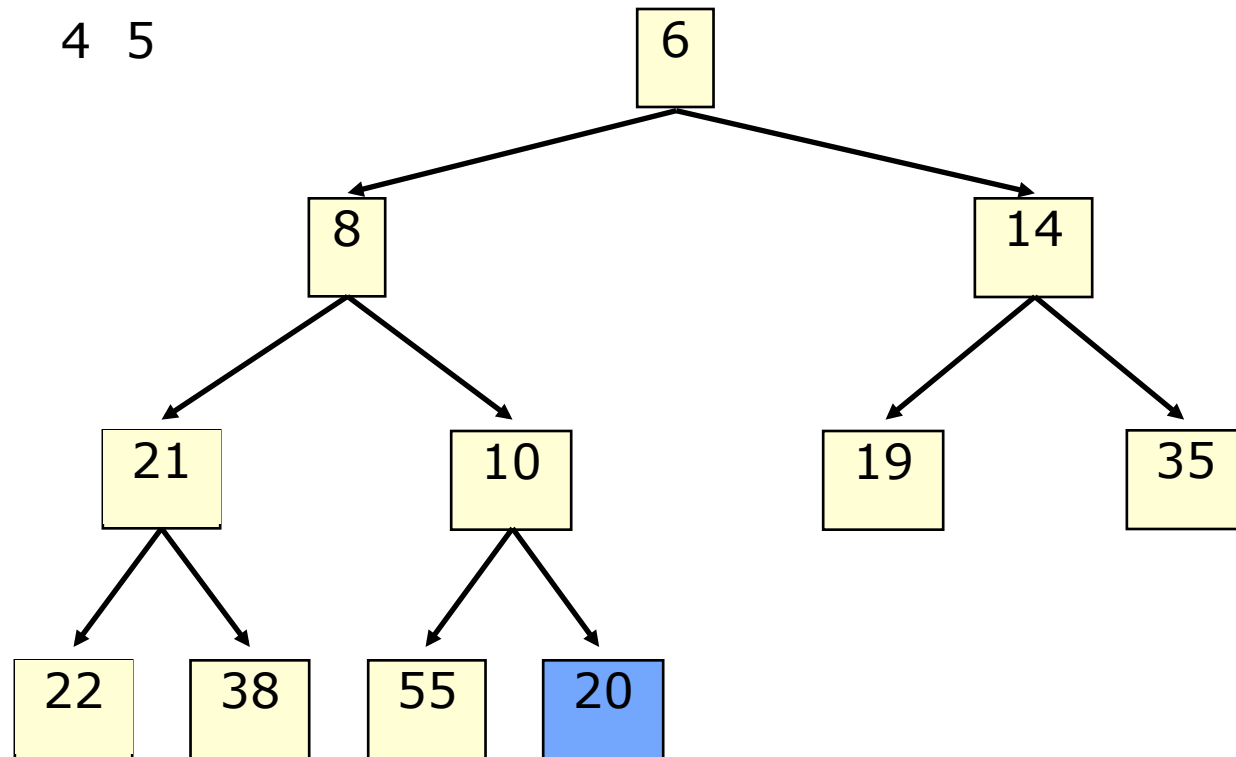
48





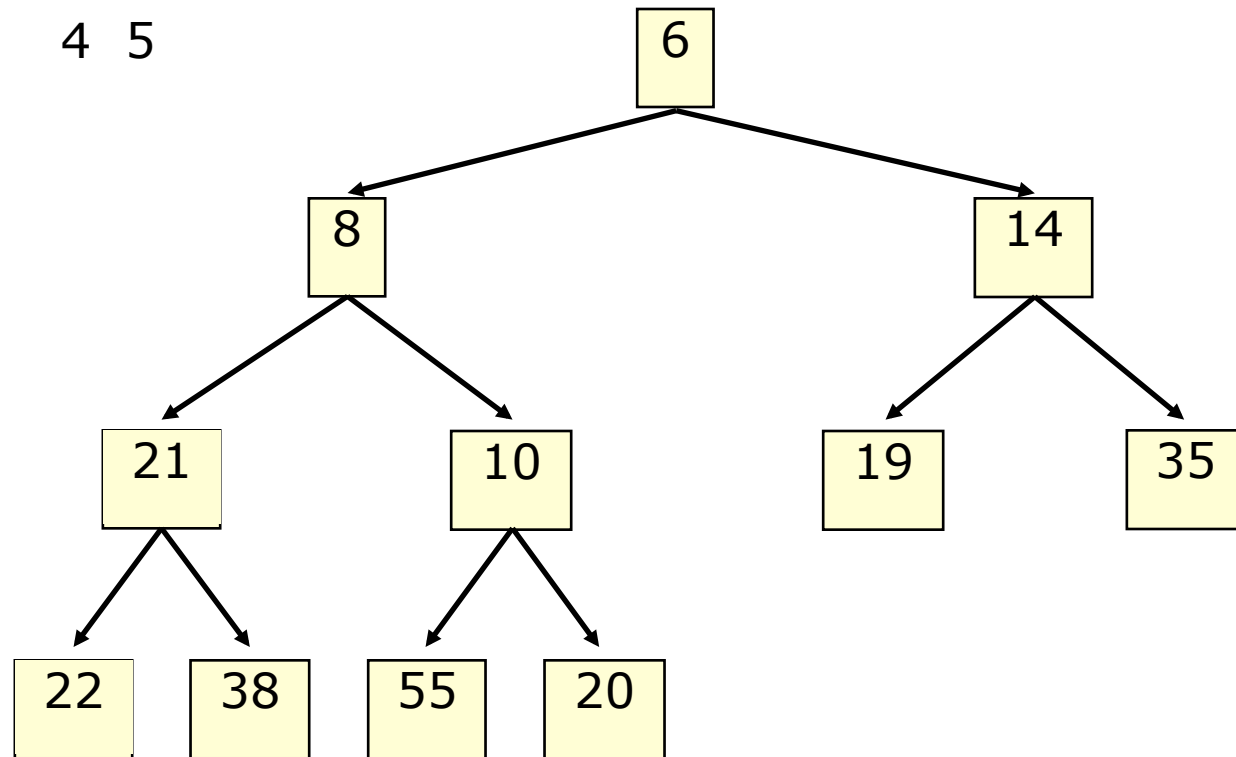
# pop ()

49



# pop ()

50



# pop ()

51

- Time is  $O(\log n)$ , since the tree is balanced

# pop ()

52

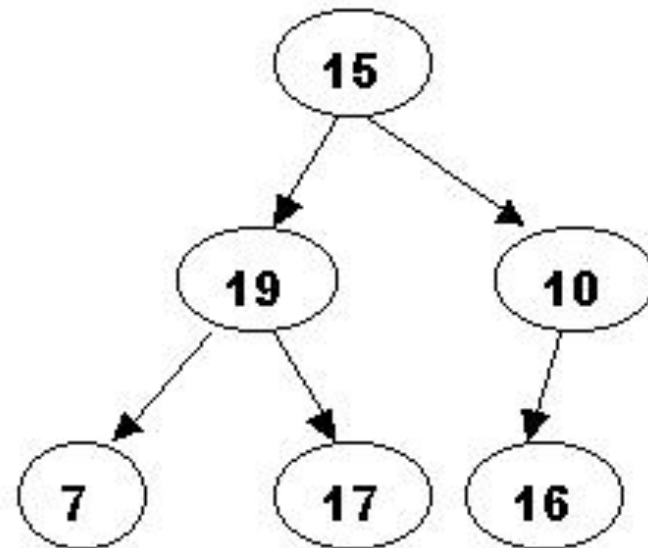
```
void ArrayMinHeap<T>::pop()
{ items_[1] = items_.back();
  rotateDown(1);
}
```

```
void ArrayMinHeap<T>::rotateDown(int idx)
{
  if(idx == leaf node) return;
  int smallerChild = 2*idx; // start w/ left
  if(right child exists) {
    int rChild = smallerChild+1; if(items_[rChild]
    < items_[smallerChild])
    smallerChild = rChild;
  }
  if(items_[idx] > items_[smallerChild])
  { swap(items_[idx], items_[smallerChild]);
    heapify(smallerChild);
  }
}
```

# Build the Heap Tree

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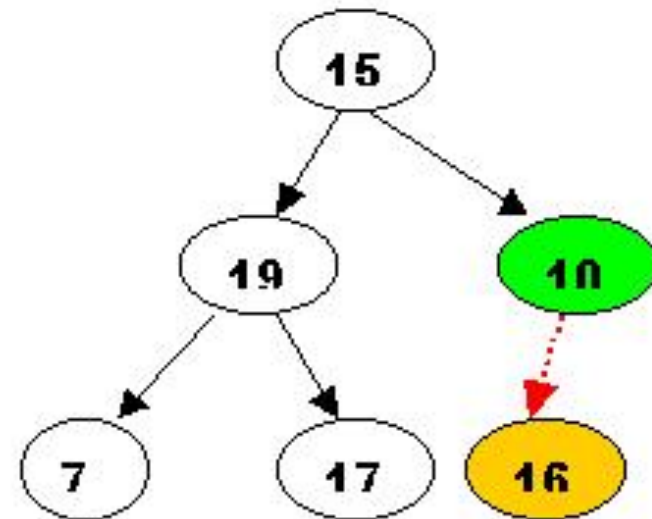
15	19	10	7	17	16
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# Build the Heap Tree

54

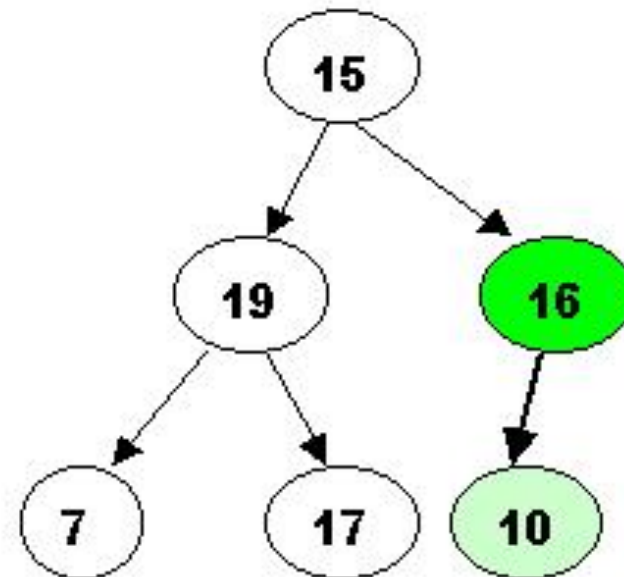
15	19	10	7	17	16
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# Build the Heap Tree

55

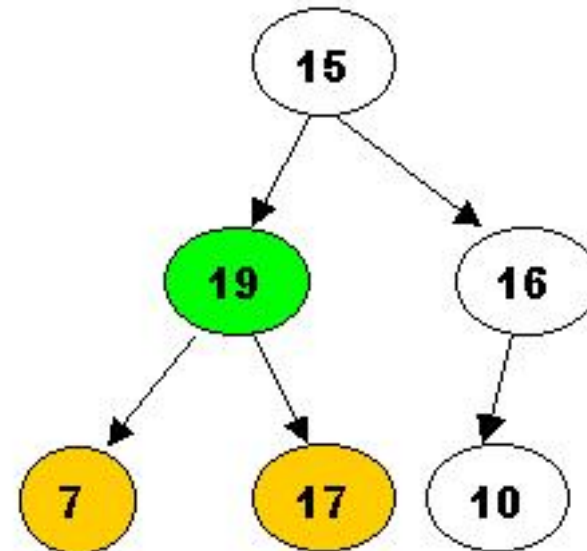
15	19	16	7	17	10
----	----	----	---	----	----



# Build the Heap Tree

56

15	19	16	7	17	10
----	----	----	---	----	----

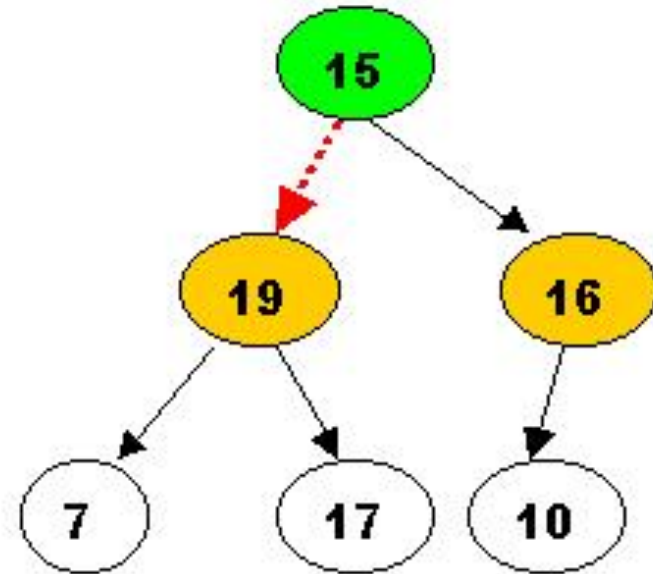




# Build the Heap Tree

57

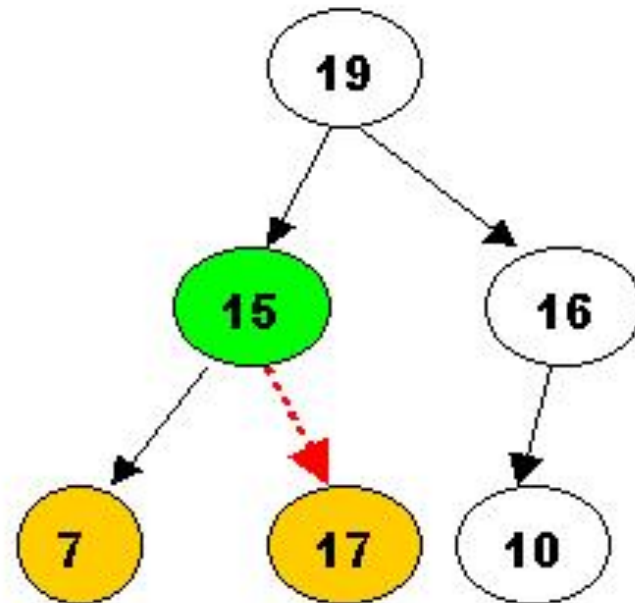
15	19	16	7	17	10
----	----	----	---	----	----



# Build the Heap Tree

58

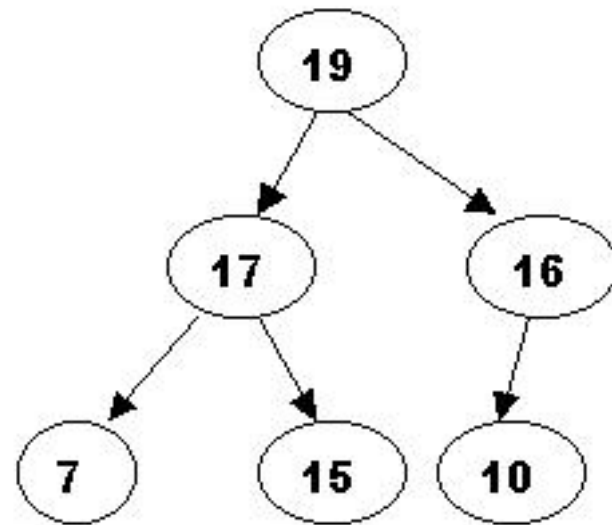
19	15	16	7	17	10
----	----	----	---	----	----



# Build the Heap Tree

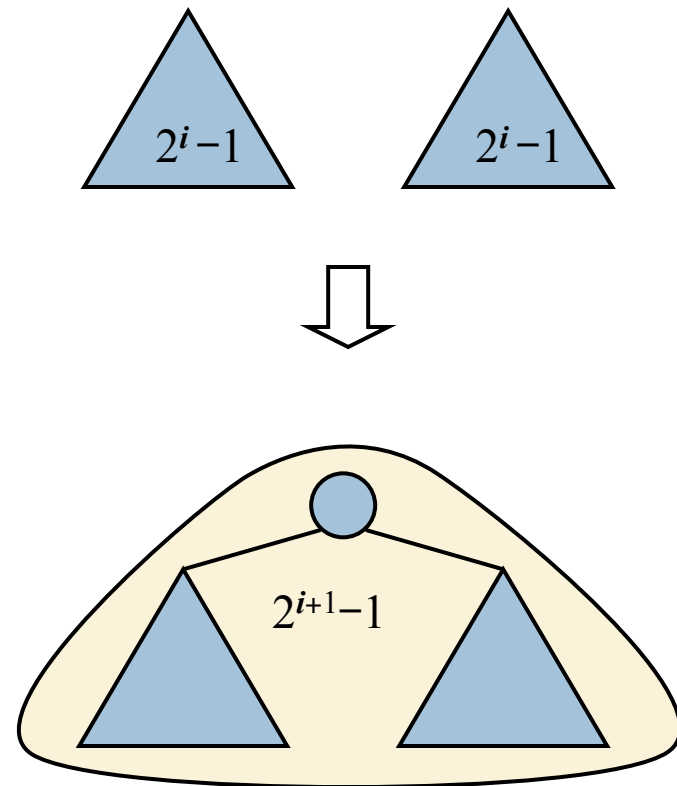
59

19	17	16	7	15	10
----	----	----	---	----	----



# Bottom-up Heap Construction

- We can construct a heap storing  $n$  given keys in using a bottom-up construction with  $\log n$  phases
- In phase  $i$ , pairs of heaps with  $2^i - 1$  keys are merged into heaps with  $2^{i+1} - 1$  keys

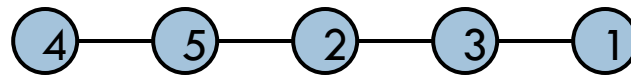


# Heap-Sort

- Consider a priority queue with  $n$  items implemented by means of a heap
  - the space used is  $O(n)$
  - methods **push** **and** **pop** take  $O(\log n)$  time
  - methods **size**, **isEmpty**, **minKey**, and **minElement** take time  $O(1)$  time
- Using a heap-based priority queue, we can sort a sequence of  $n$  elements in  $O(n \log n)$  time
- The resulting algorithm is called heap-sort
- Heap-sort is much faster than quadratic sorting algorithms, such as insertion-sort and selection-sort

# Exercise: Heap-Sort

- Heap-sort is the variation of PQ-sort where the priority queue is implemented with a heap



- Illustrate the performance of heap-sort on the following input sequence:
  - (22, 15, 36, 44, 10, 3, 9, 13, 29, 25)

# Priority Queue Sort Summary

- PQ-Sort consists of  $n$  insertions followed by  $n$  removeMin ops

	Insert	RemoveMin	PQ-Sort Total
Insertion Sort (ordered sequence)	$O(n)$	$O(1)$	$O(n^2)$
Selection Sort (unordered sequence)	$O(1)$	$O(n)$	$O(n^2)$
Heap Sort (binary heap, vector-based implementation)	$O(\log n)$	$O(\log n)$	$O(n \log n)$