

**Winter 2016**  
**COMP-250: Introduction**  
**to Computer Science**

Lecture 20, March 24, 2016

# Public Announcement

## GETTING YOUR DREAM TECH INTERNSHIP

MARCH 29<sup>TH</sup> 6PM-7:30PM

TROTTIER 0070

COME LEARN HOW TO APPLY TO COMPANIES, PREPARE FOR INTERVIEWS, AND WHAT  
COURSES TO TAKE! PRESENTED BY SUCCESSFUL INTERNS:



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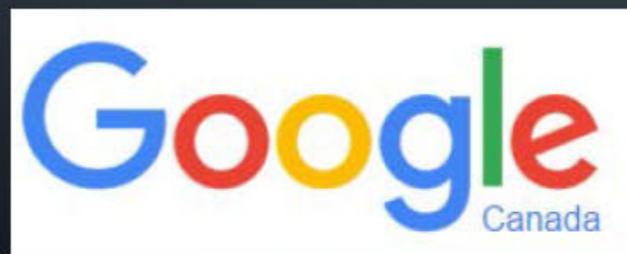


Michael Ho  
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Kevin Luk  
CS/Bio U3  
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# Public Announcement

Course :  
**COMP 250 Sect: 1**

Title:  
**Intro to Computer Science**

Exam Date:  
**4/28/2016**

Exam Time:  
**2:00:00 PM**

# Mercury Course Evaluations



**MERCURY**  
COURSE EVALUATION

**Course evaluations matter. Evaluate your courses and instructors!**

**Default period:**

March 21 - May 1

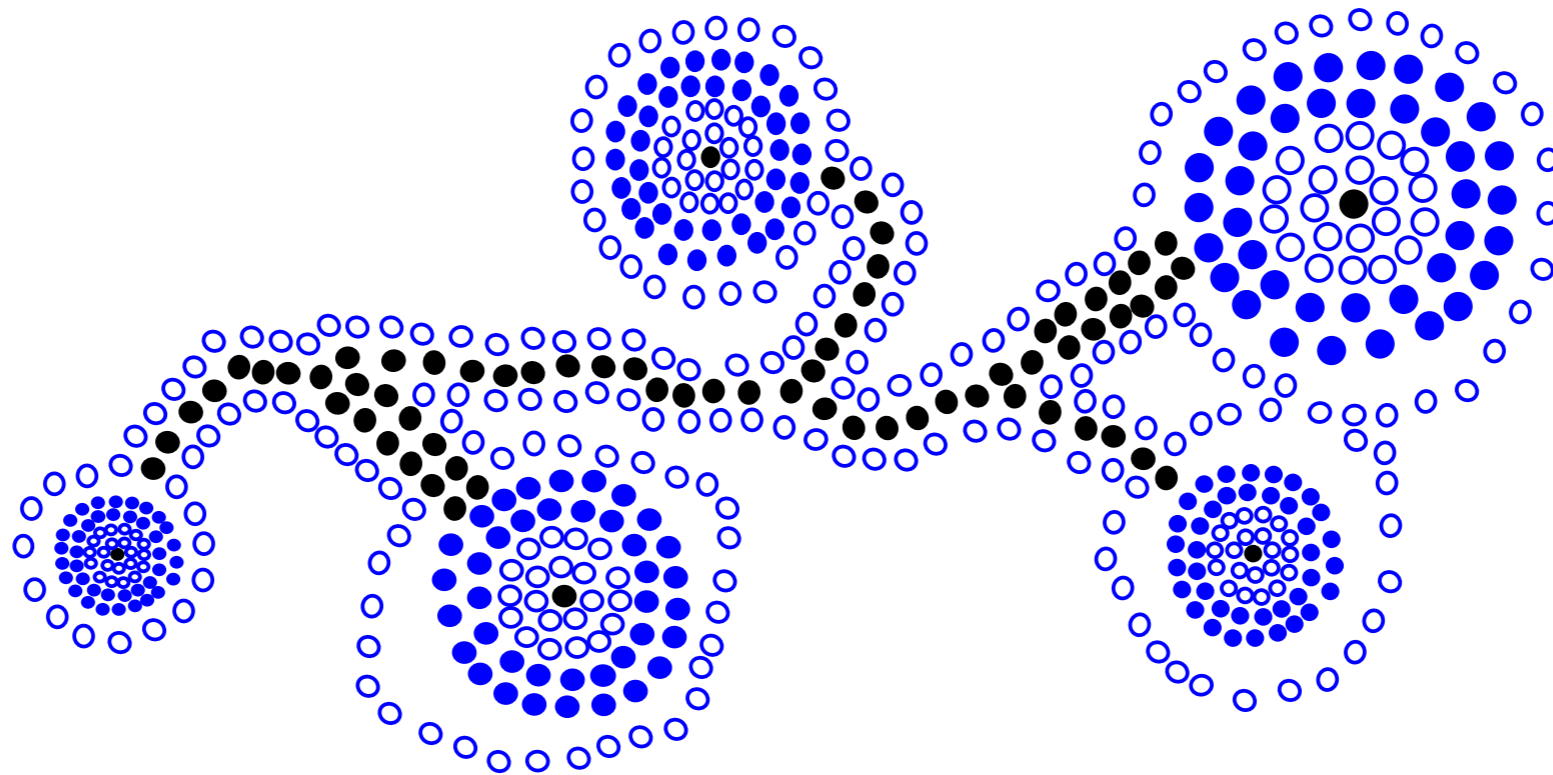
**Condensed period:**

March 21 - April 17

Click **HERE** to complete your course evaluations.

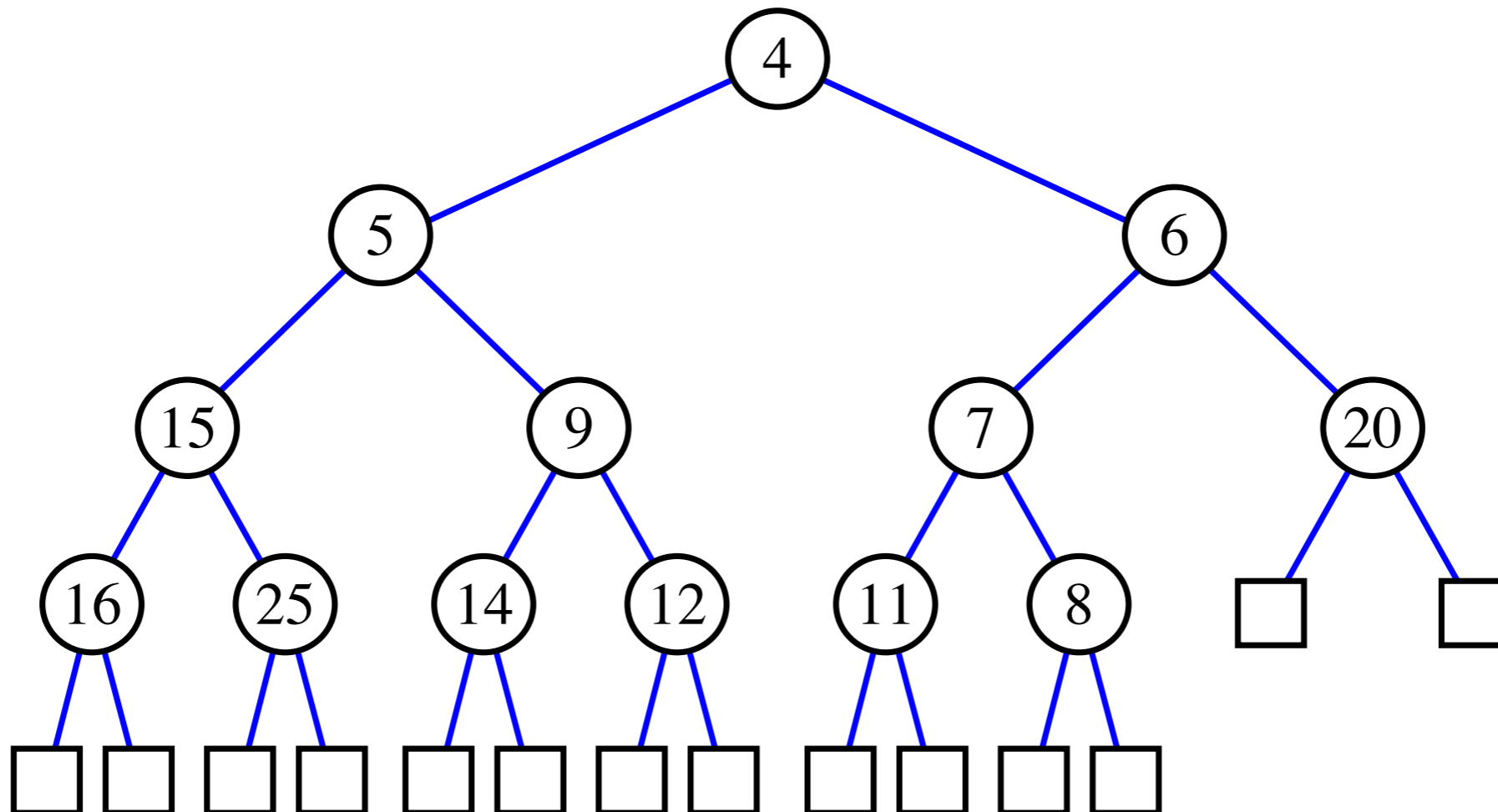
# HEAPS I

- Heaps
- Properties
- Insertion and Deletion



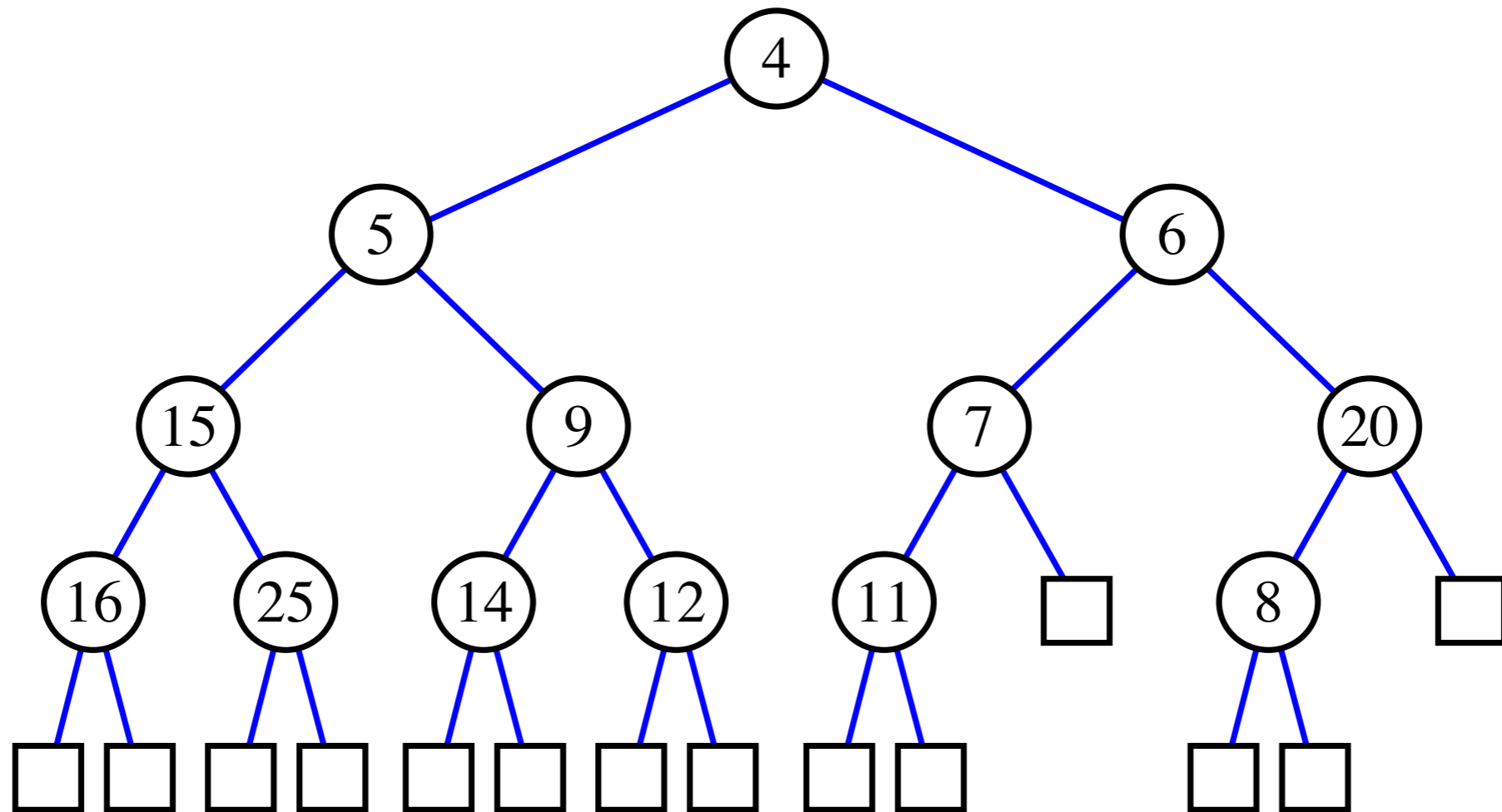
# Heaps

- A *heap* is a binary tree  $T$  that stores a collection of keys (or key-element pairs) at its internal nodes and that satisfies two additional properties:
  - **Order Property:**  $\text{key}(\text{parent}) \leq \text{key}(\text{child})$
  - **Structural Property:** all levels are full, except the last one, which is left-filled (*complete binary tree*)



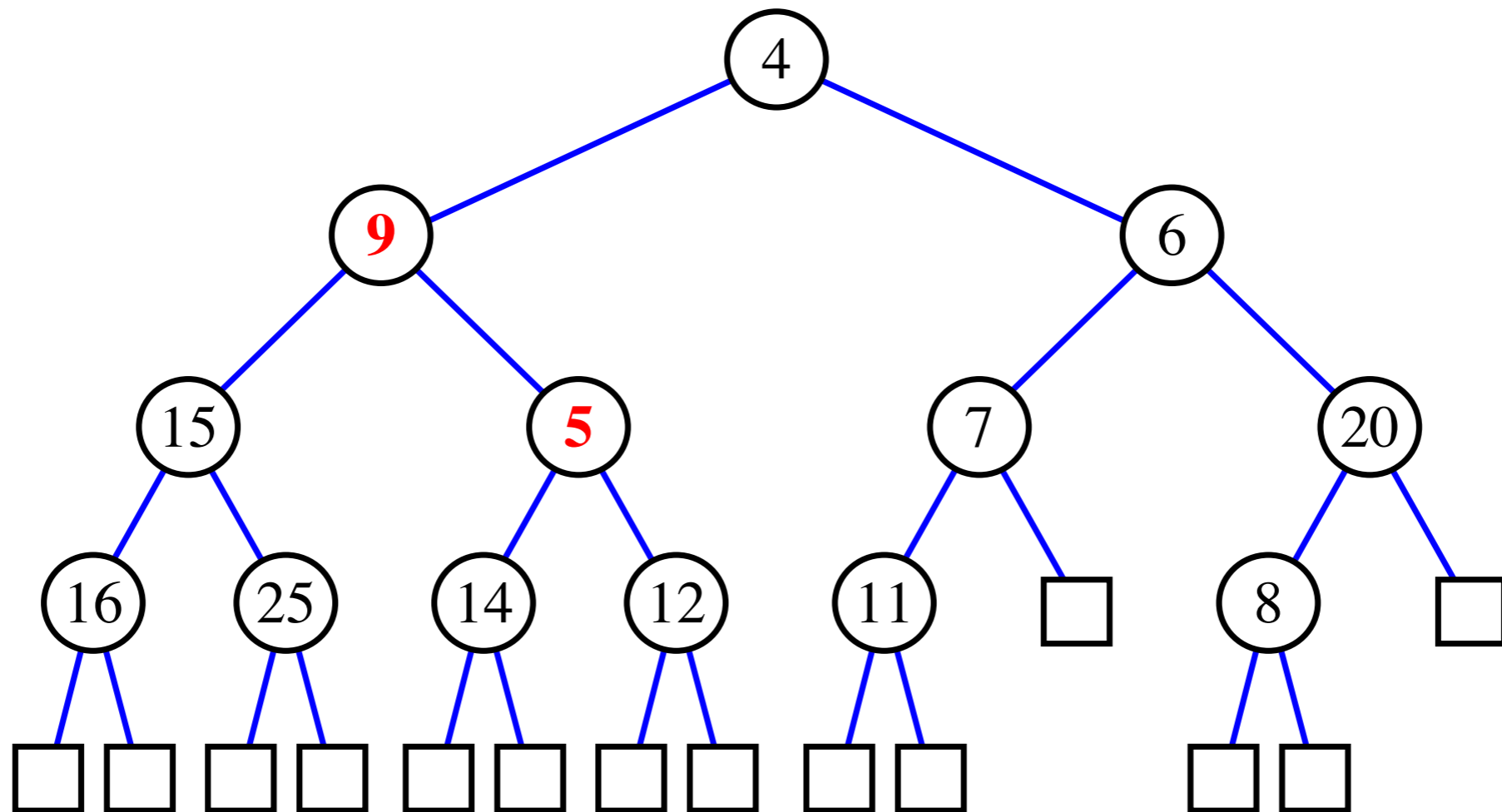
# Not Heaps

- bottom level is not left-filled



# Not Heaps

- $\text{key}(\text{parent}) > \text{key}(\text{child})$

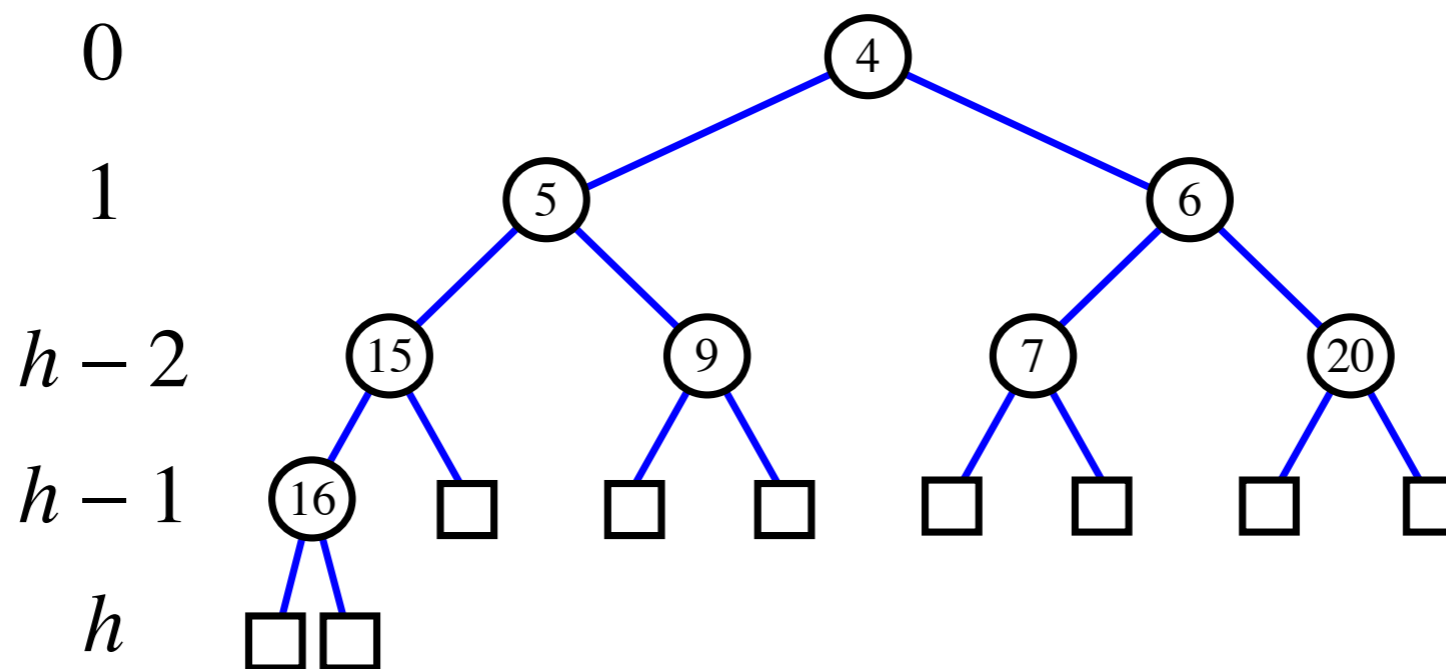




# Height of a Heap

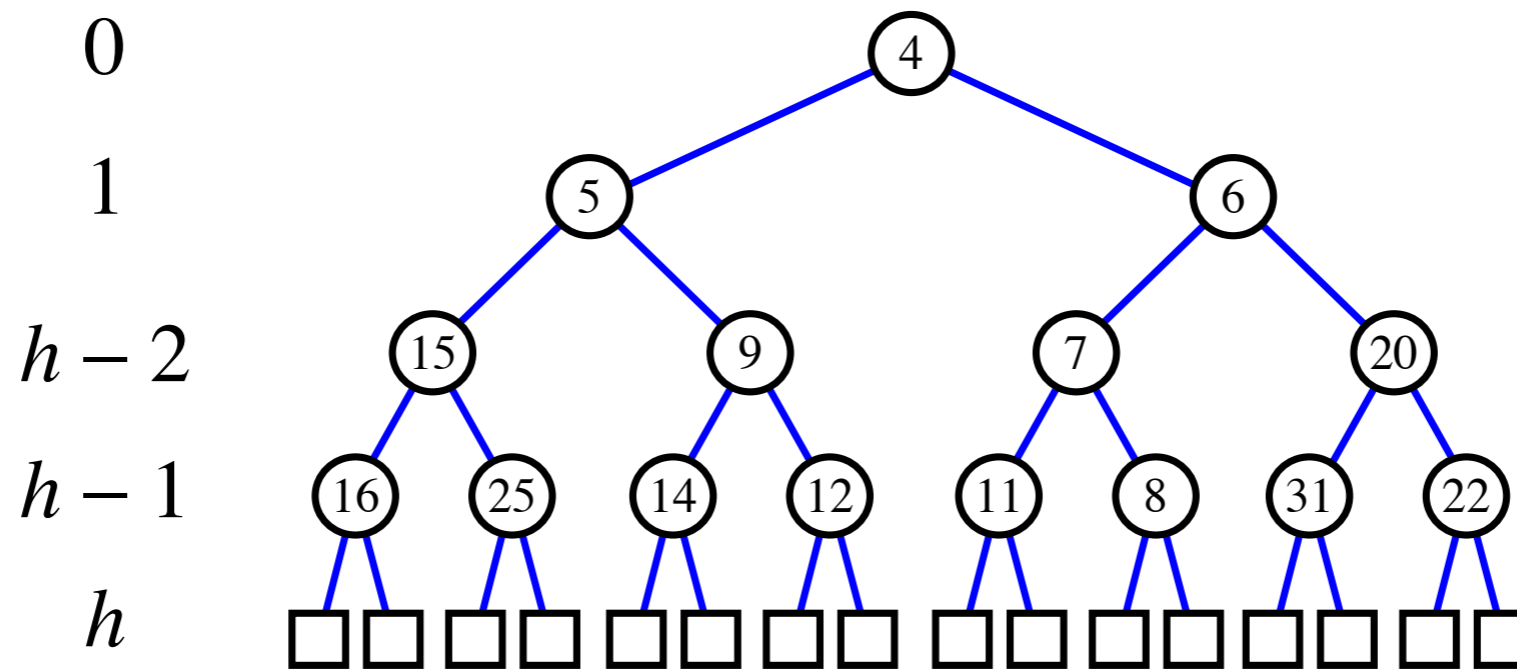
A heap  $T$  storing  $n$  keys has height  $h = \lceil \log(n + 1) \rceil$ , which is  $O(\log n)$

- $n \geq 1 + 2 + 4 + \dots + 2^{h-2} + 1 = 2^{h-1} - 1 + 1 = 2^{h-1}$



# Height of a Heap

- $n \leq 1 + 2 + 4 + \dots + 2^{h-1} = 2^h - 1$

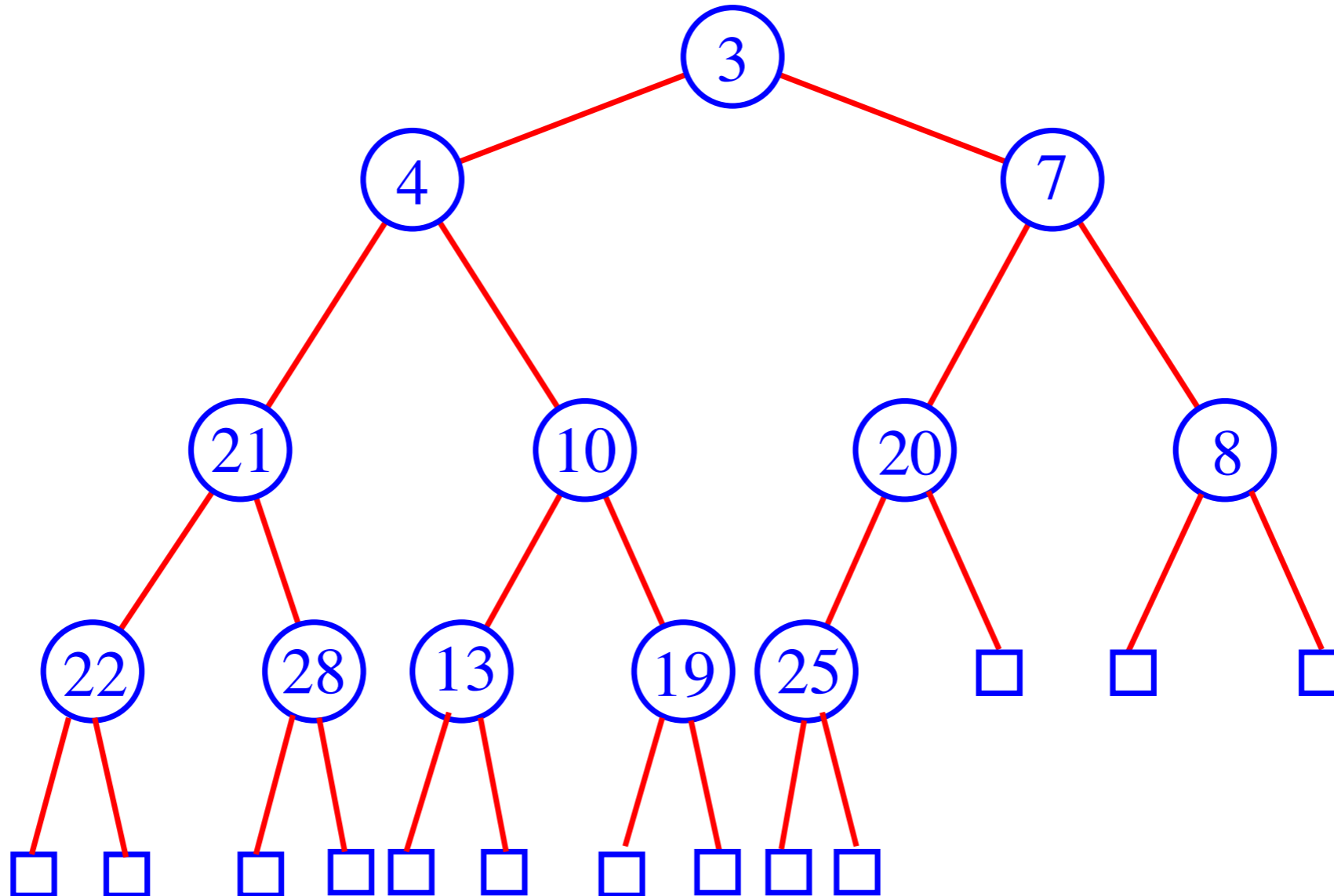


- Therefore  $2^{h-1} \leq n \leq 2^h - 1$
- Taking logs, we get  $\log(n+1) \leq h \leq \log n + 1$
- Which implies  $h = \lceil \log(n+1) \rceil$

# Heap Insertion

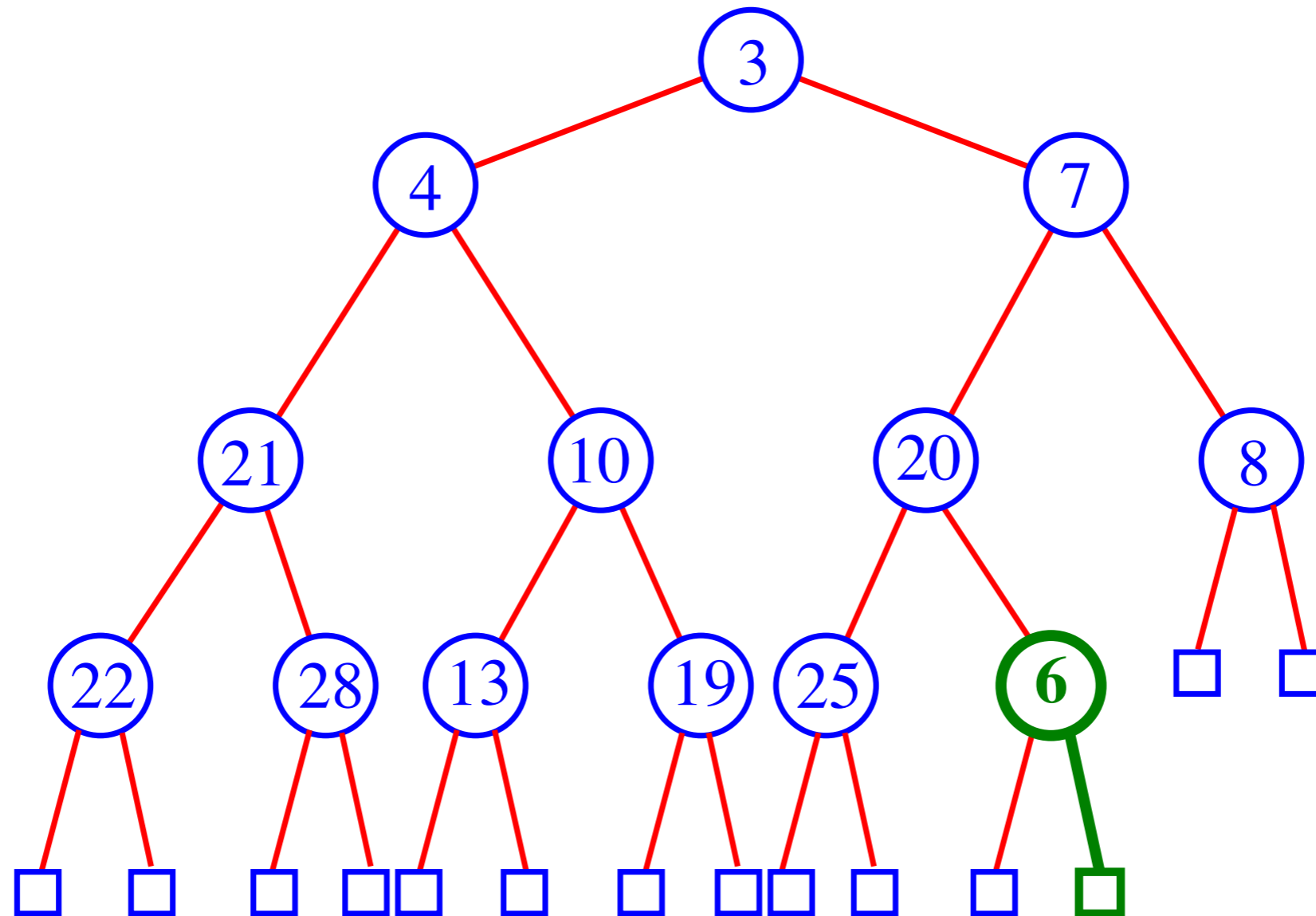
So here we go ...

The key to insert is **6**



# Heap Insertion

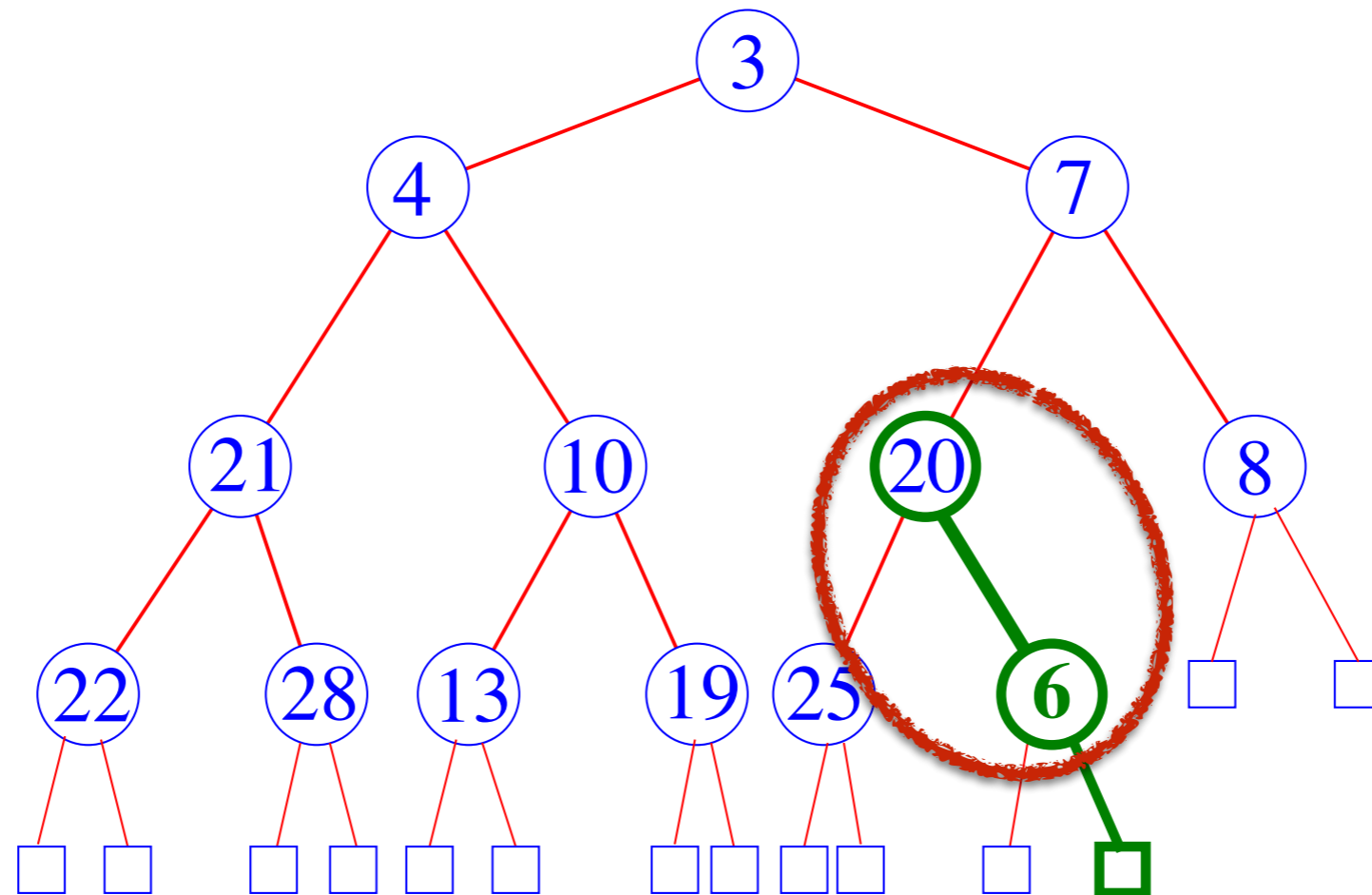
Add the key in the *next available position* in the heap.



Now begin *Upheap*.

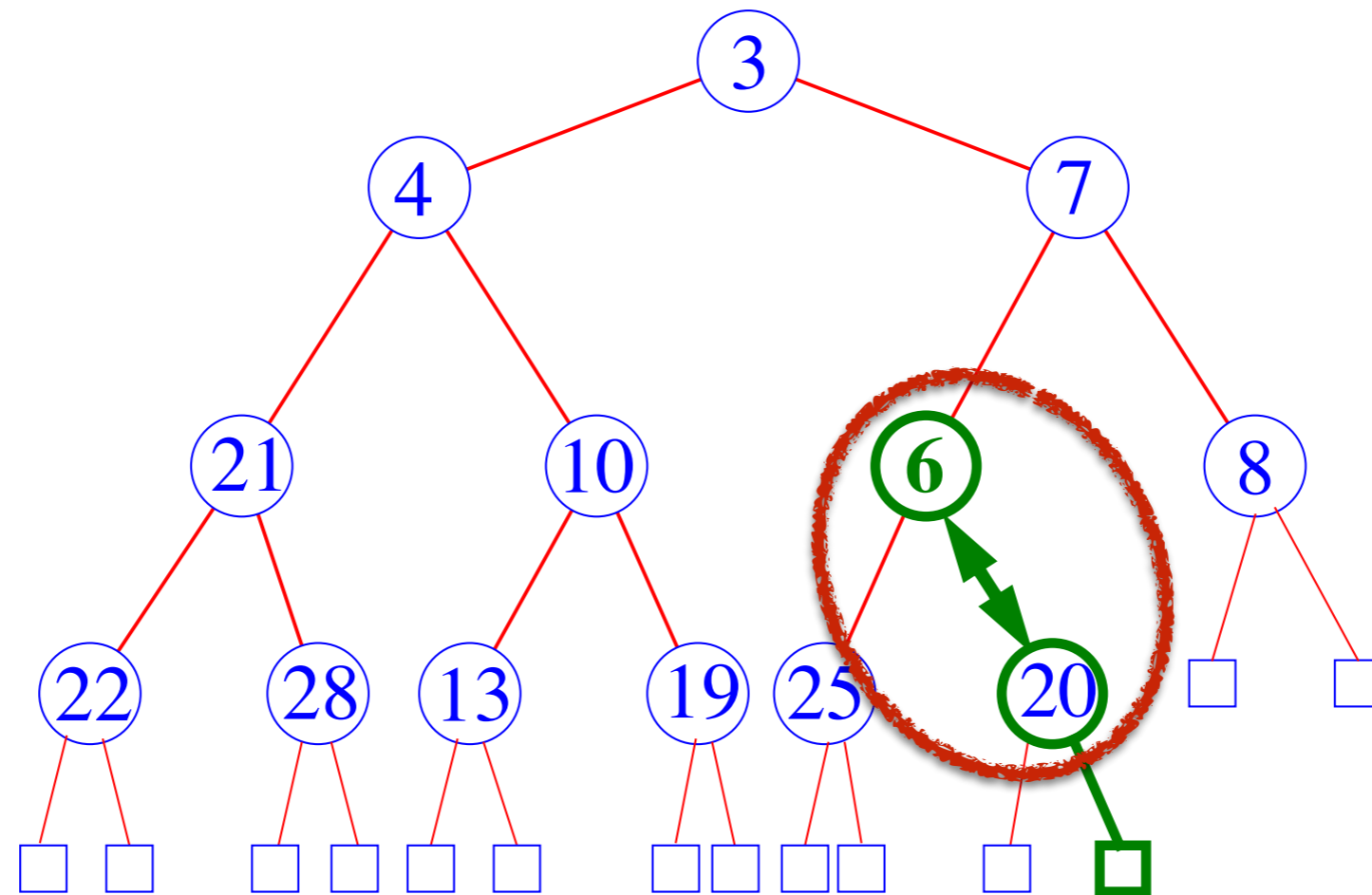
# Upheap

- *Swap parent-child keys out of order*

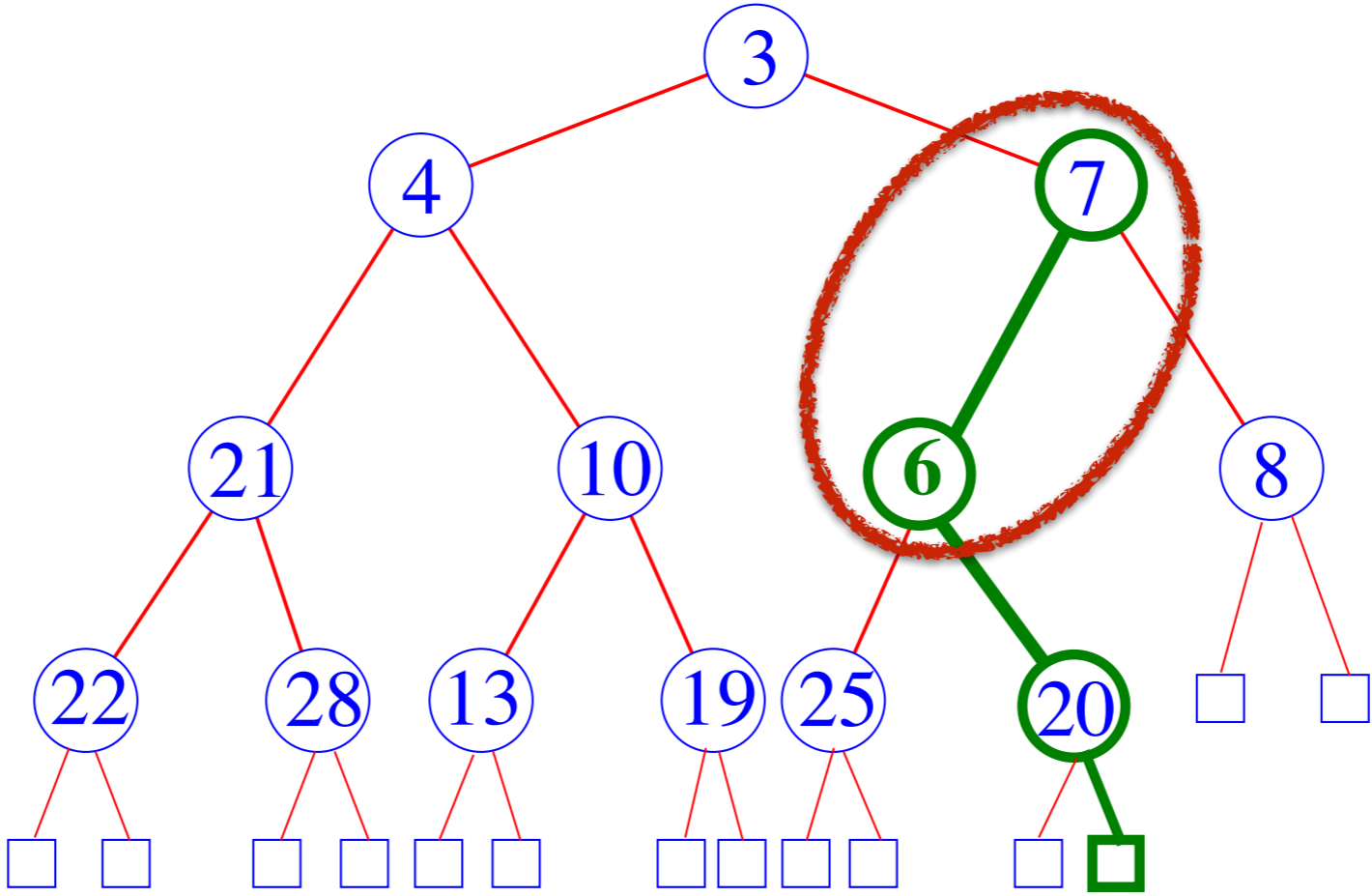


# Upheap

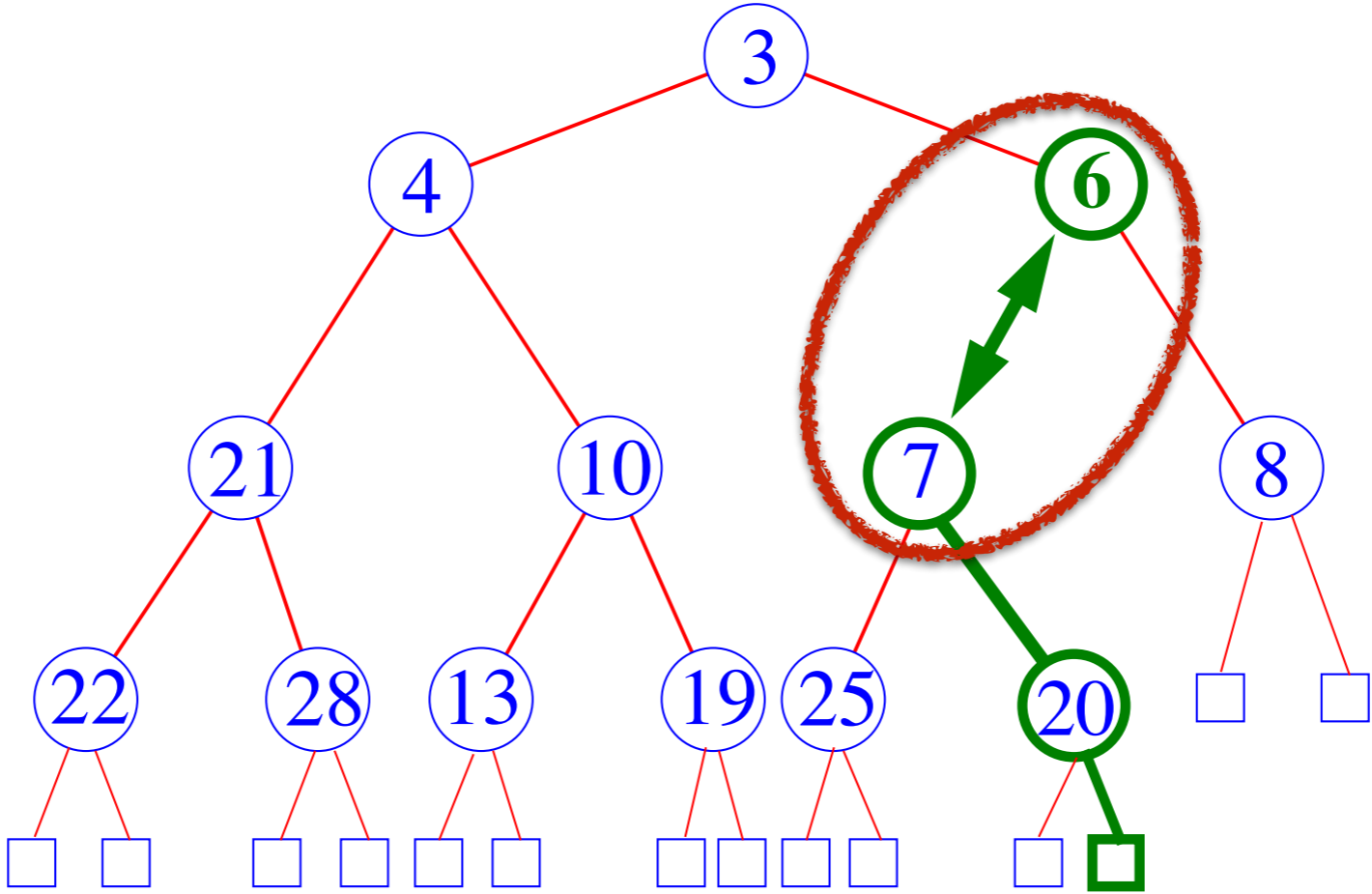
- *Swap parent-child keys out of order*



# Upheap Continues

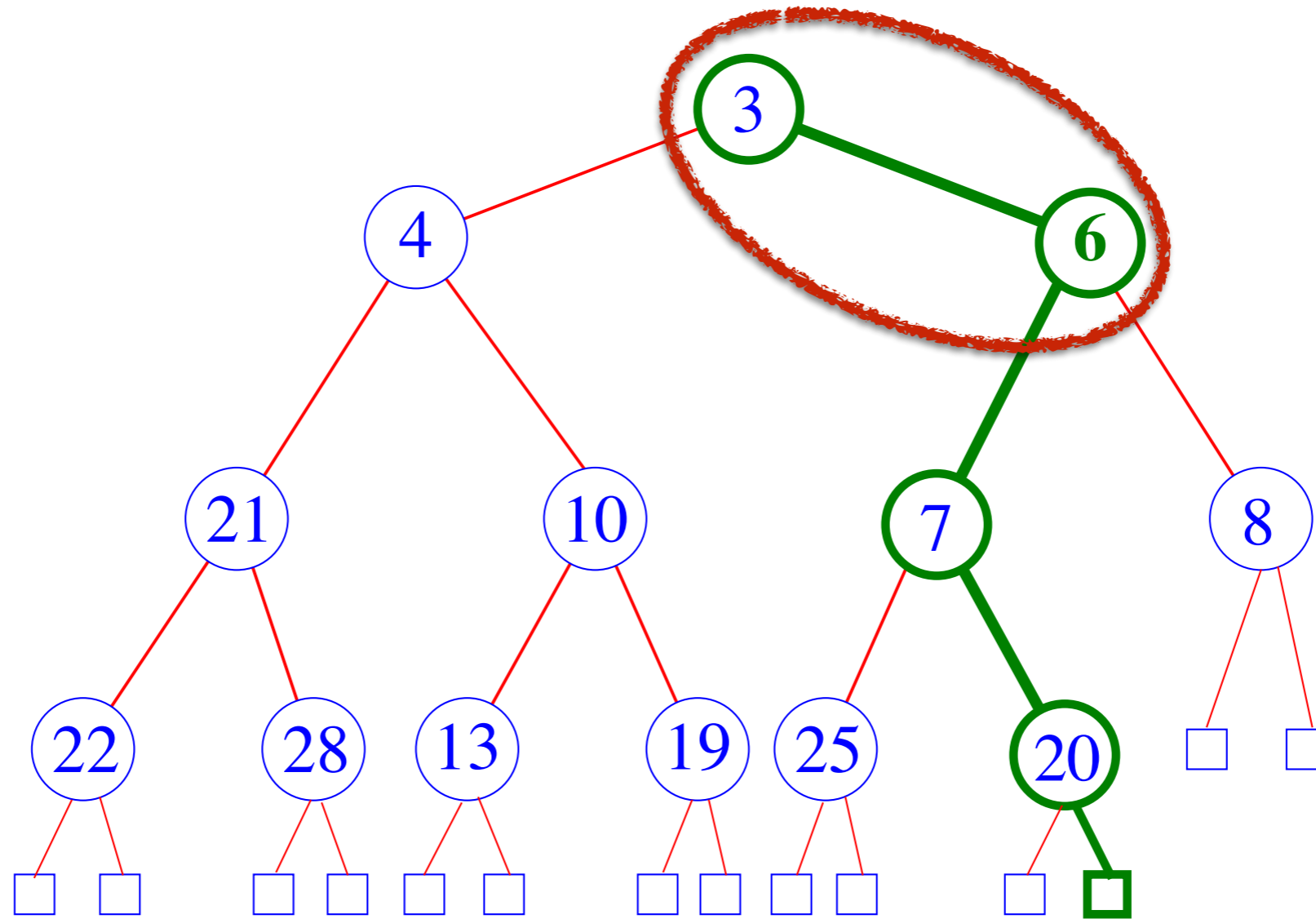


# Upheap Continues





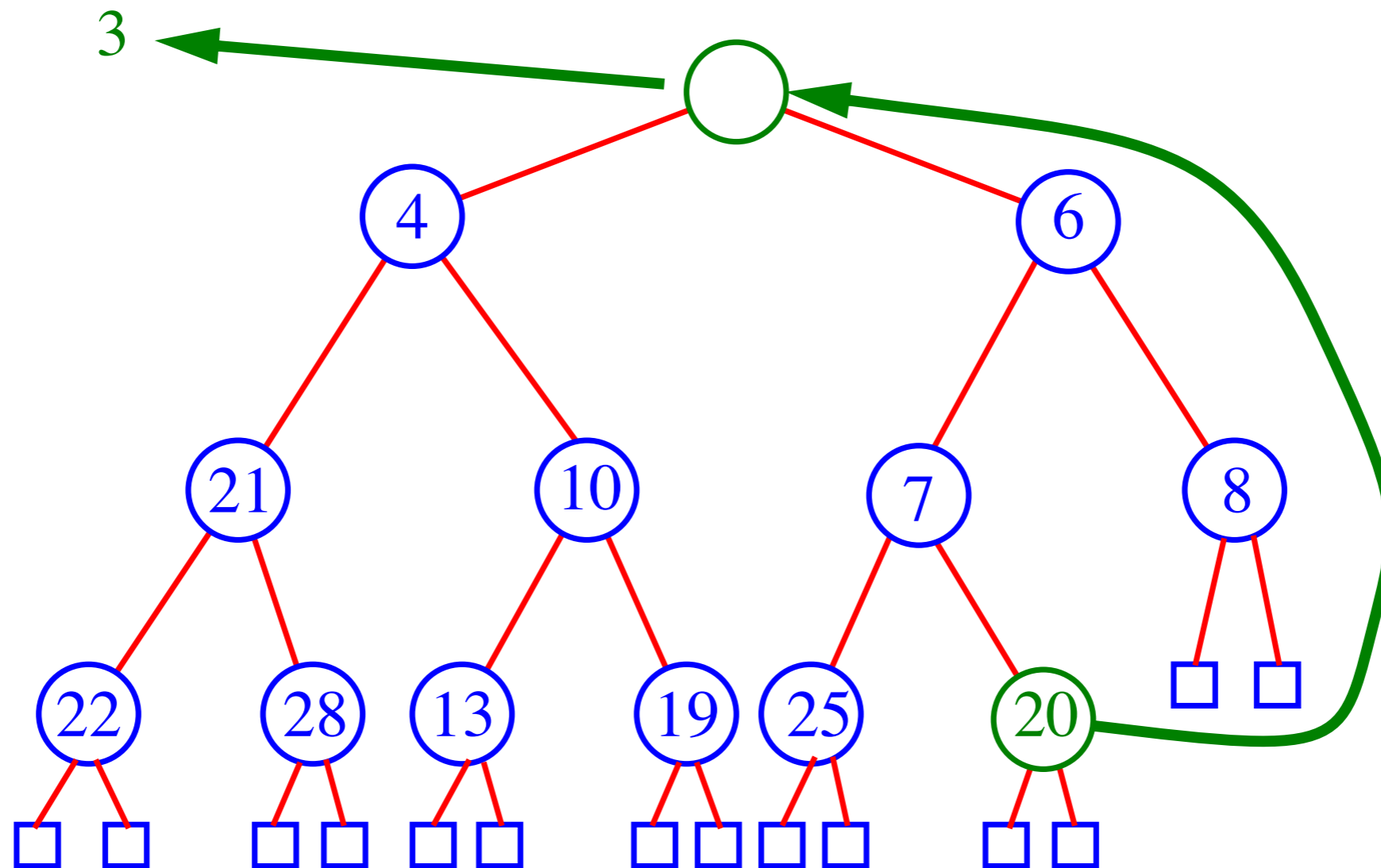
# End of Upheap

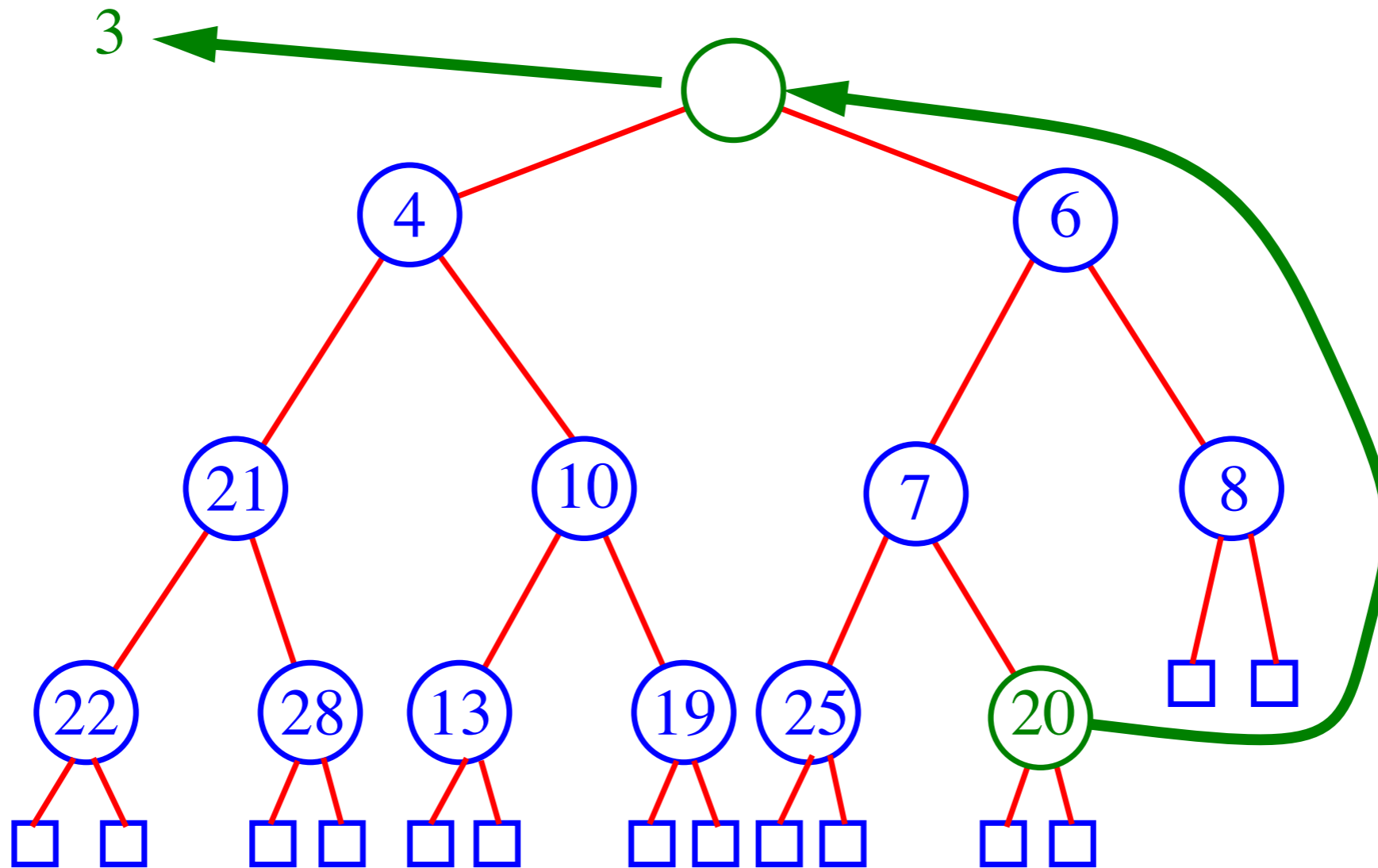


- *Upheap* terminates when new key is greater than the key of its parent **or** the top of the heap is reached
- (total #swaps)  $\leq (h - 1)$ , which is  $O(\log n)$

# Removal From a Heap

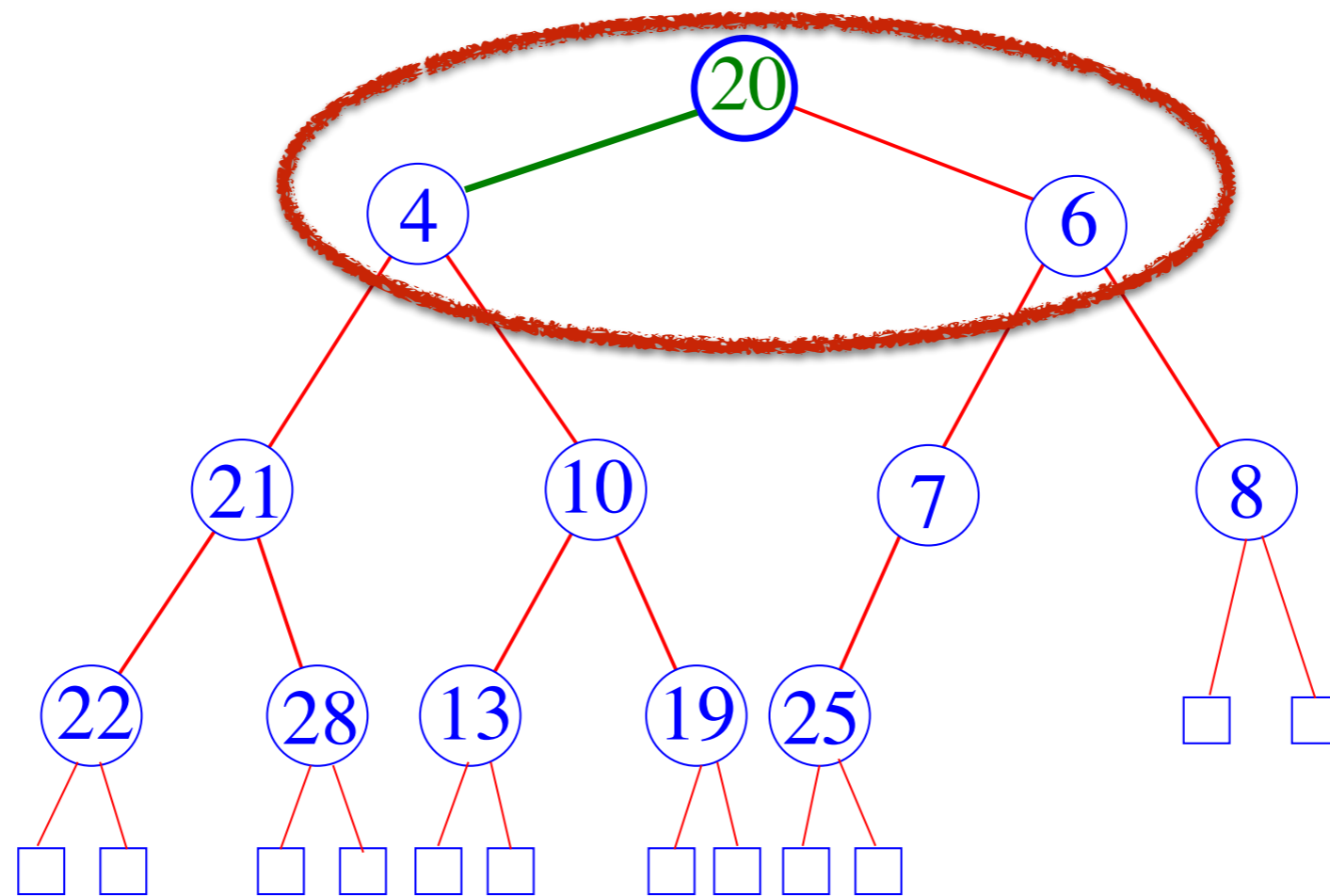
## RemoveMin()



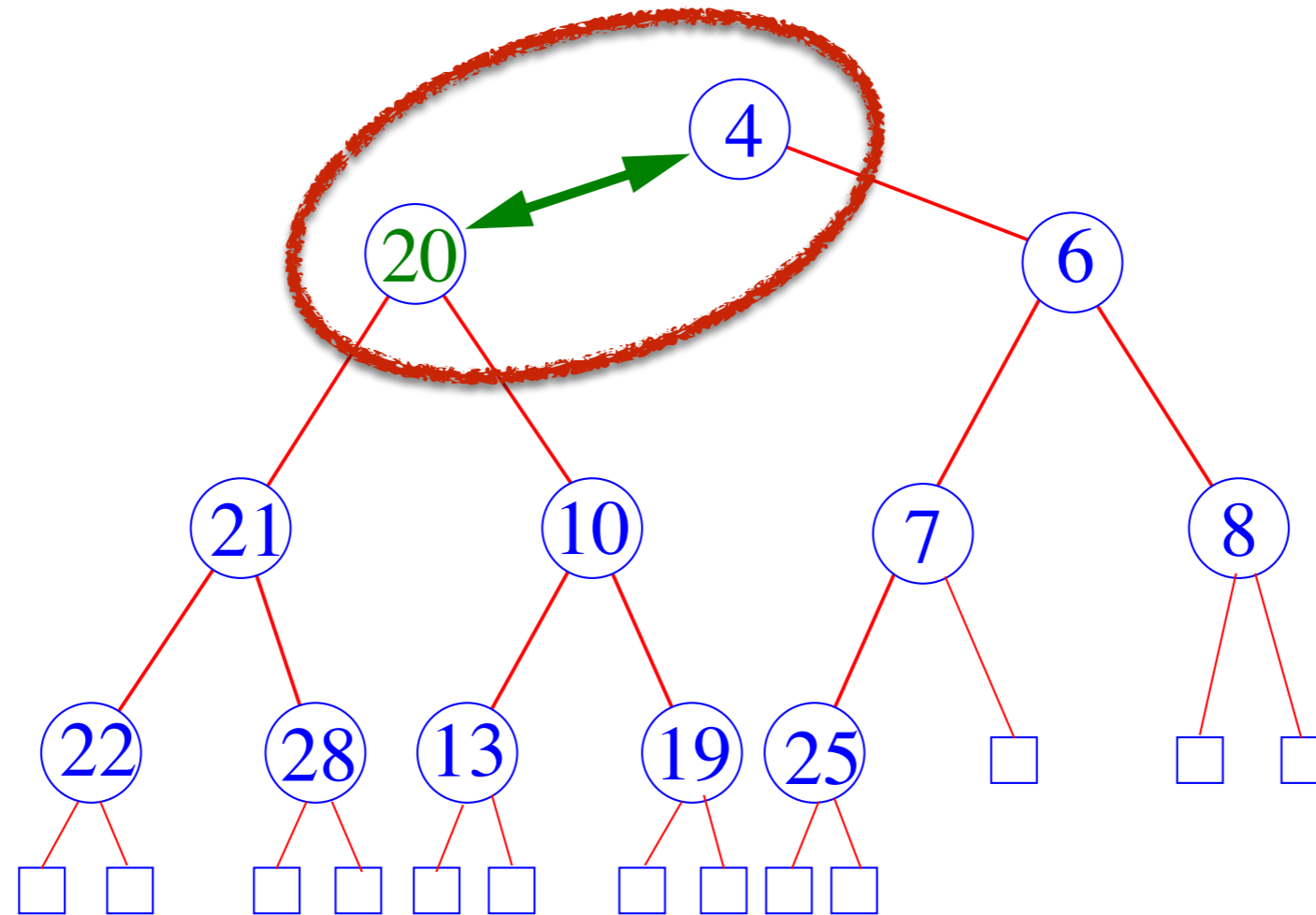


- The removal of the top key leaves a hole
- We need to fix the heap
- First, replace the hole with the last key in the heap
- Then, begin *Downheap*

# Downheap

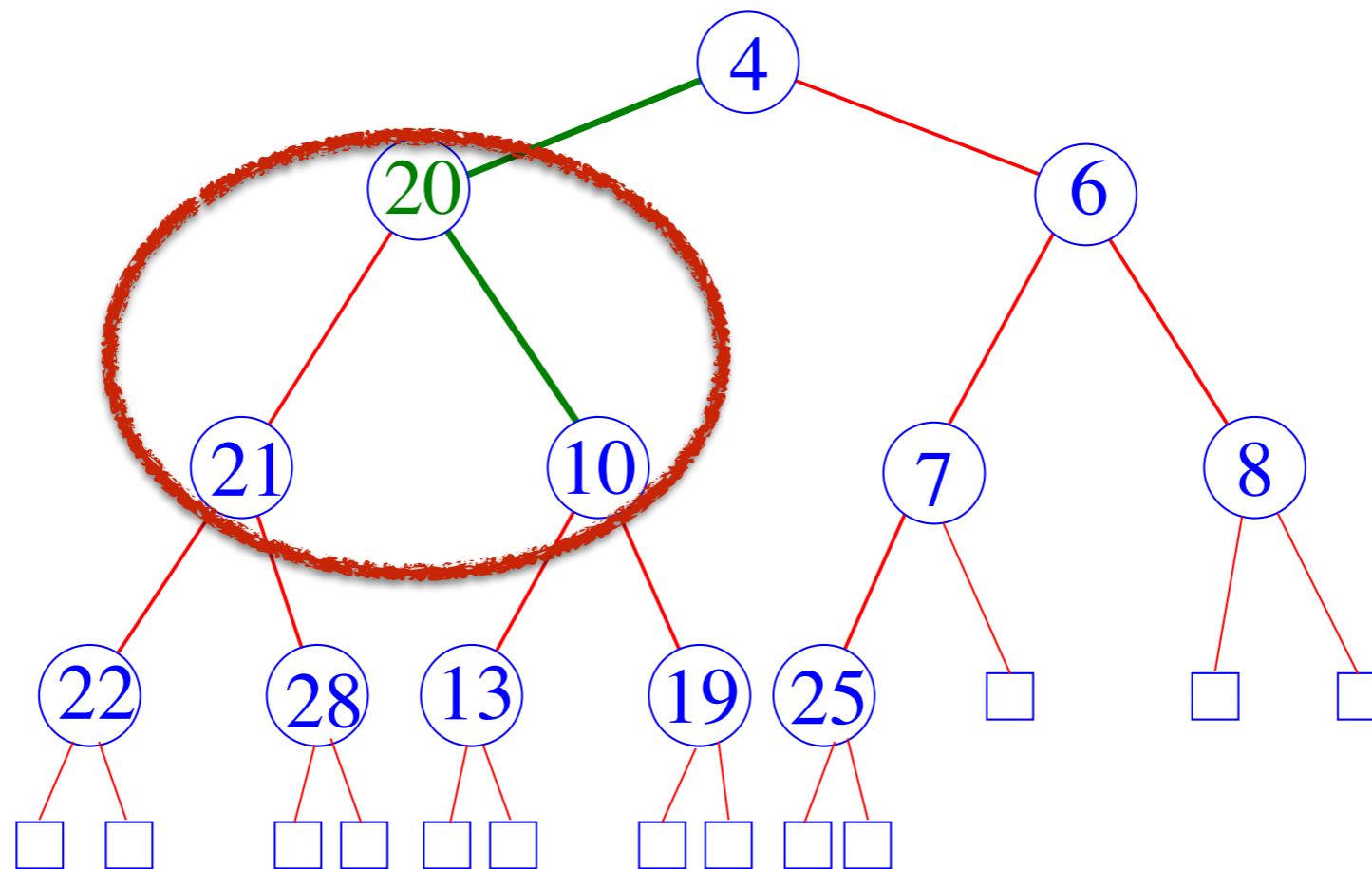


# Downheap

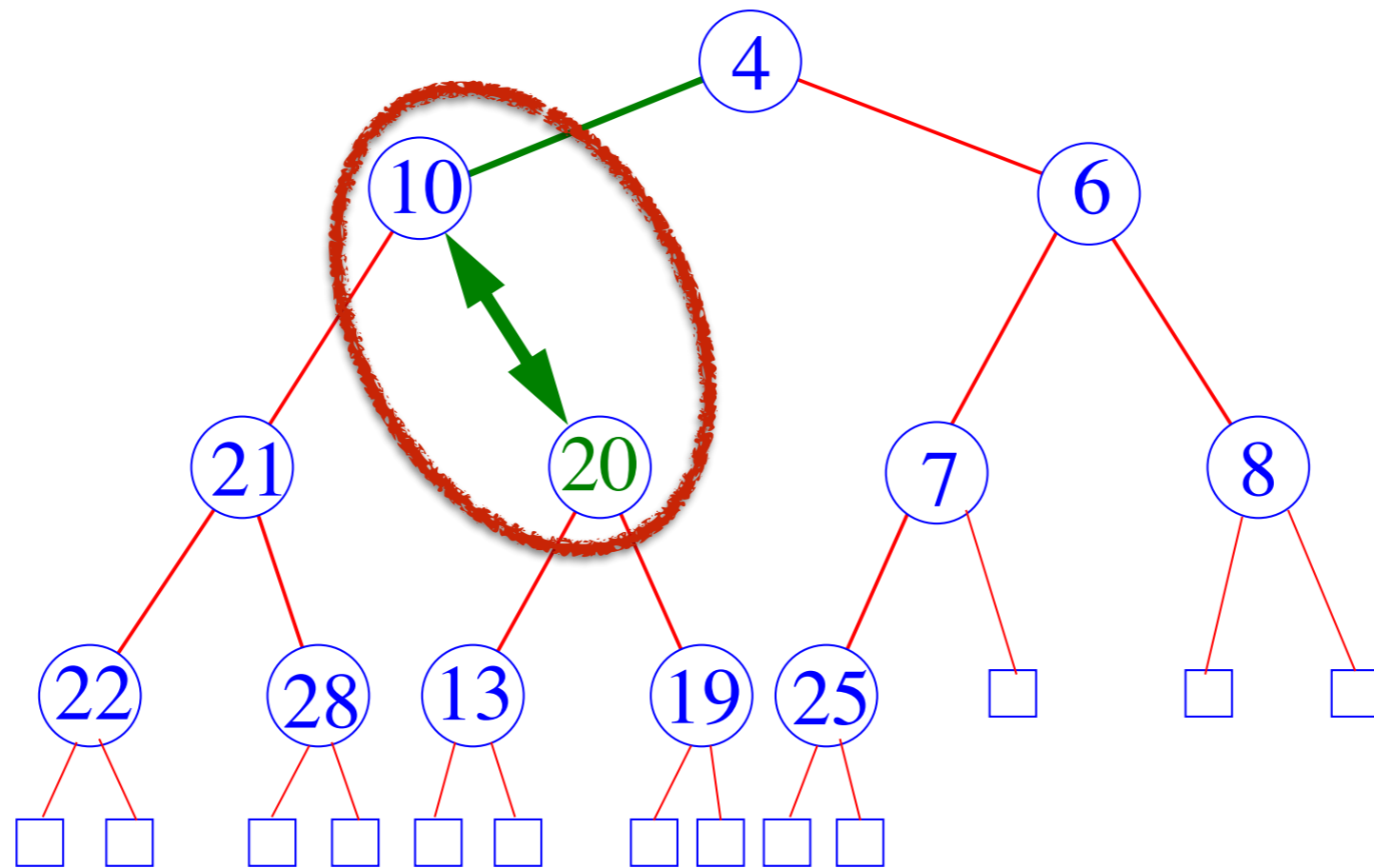


***Downheap*** compares the parent with the smallest child. If the child is smaller, it switches the two.

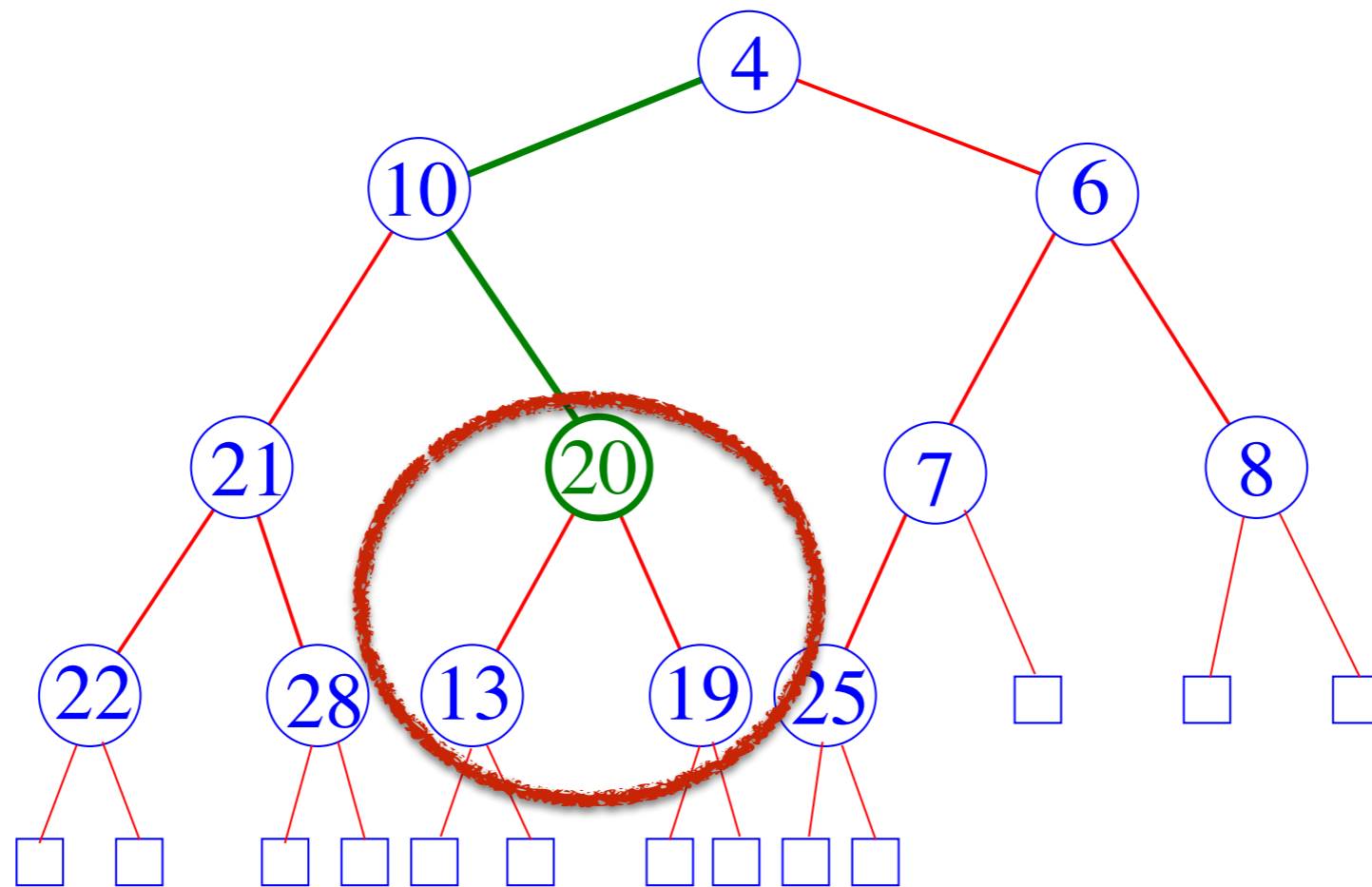
# Downheap Continues



# Downheap Continues

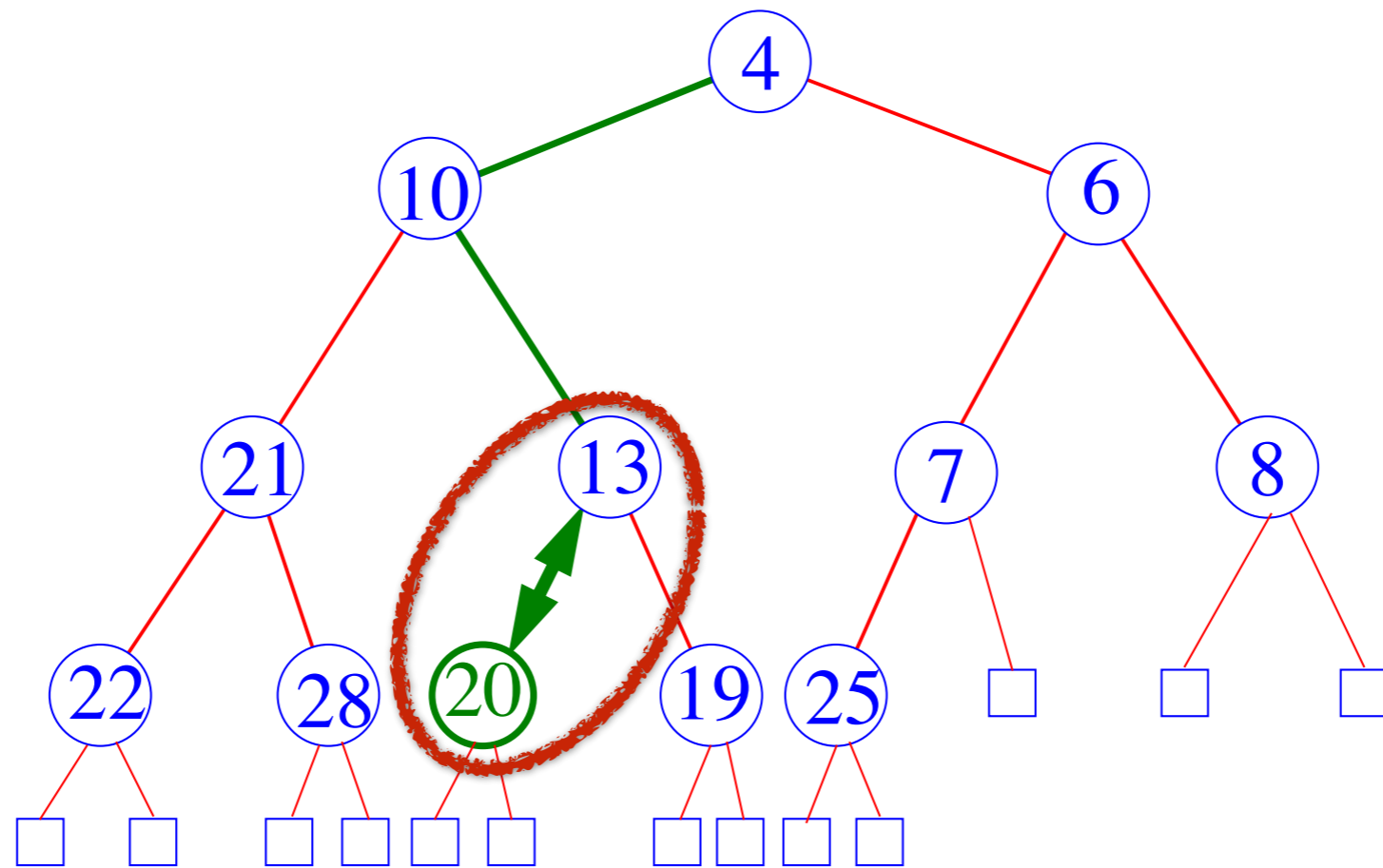


# Downheap Continues

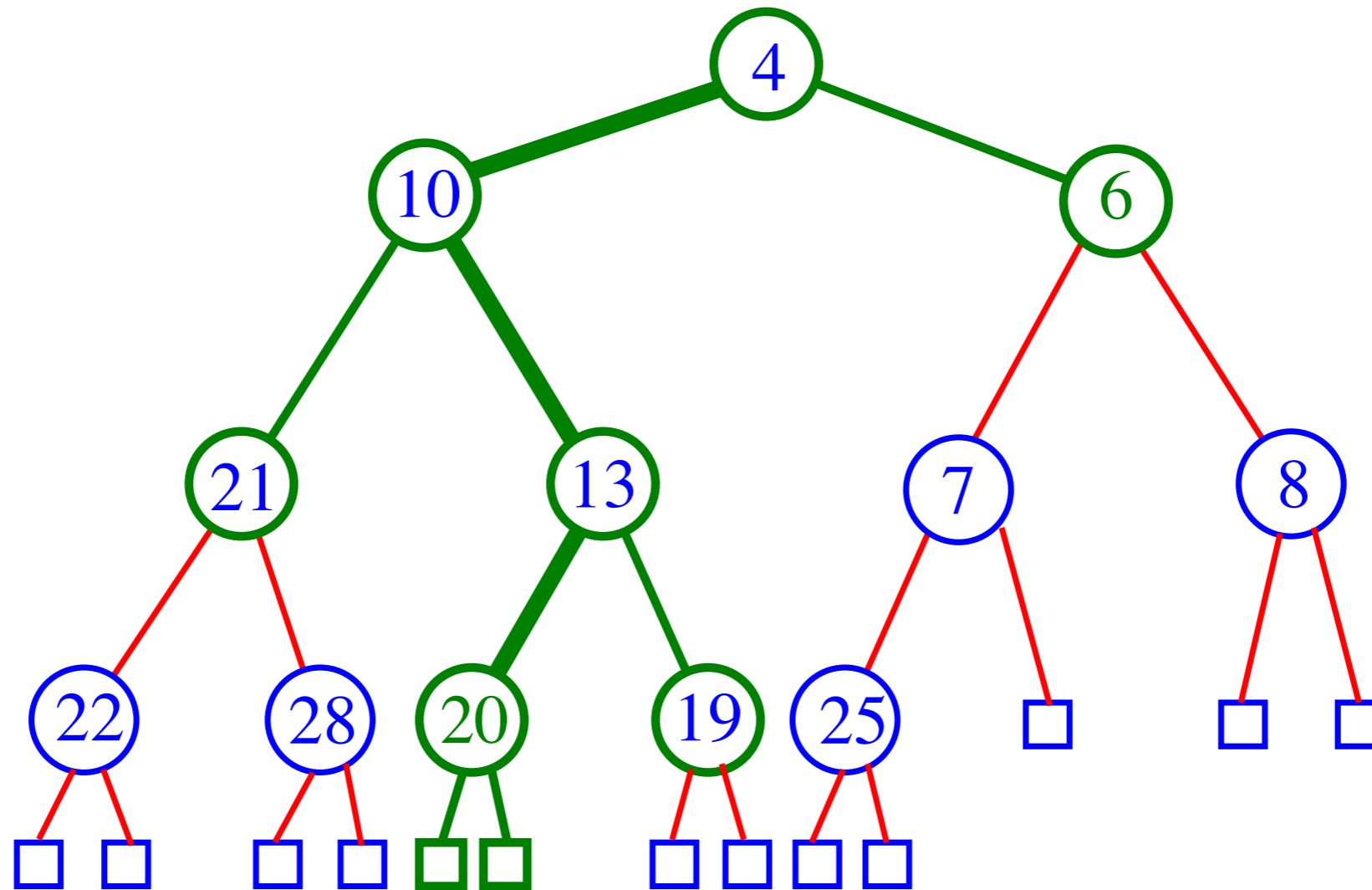




# Downheap Continues



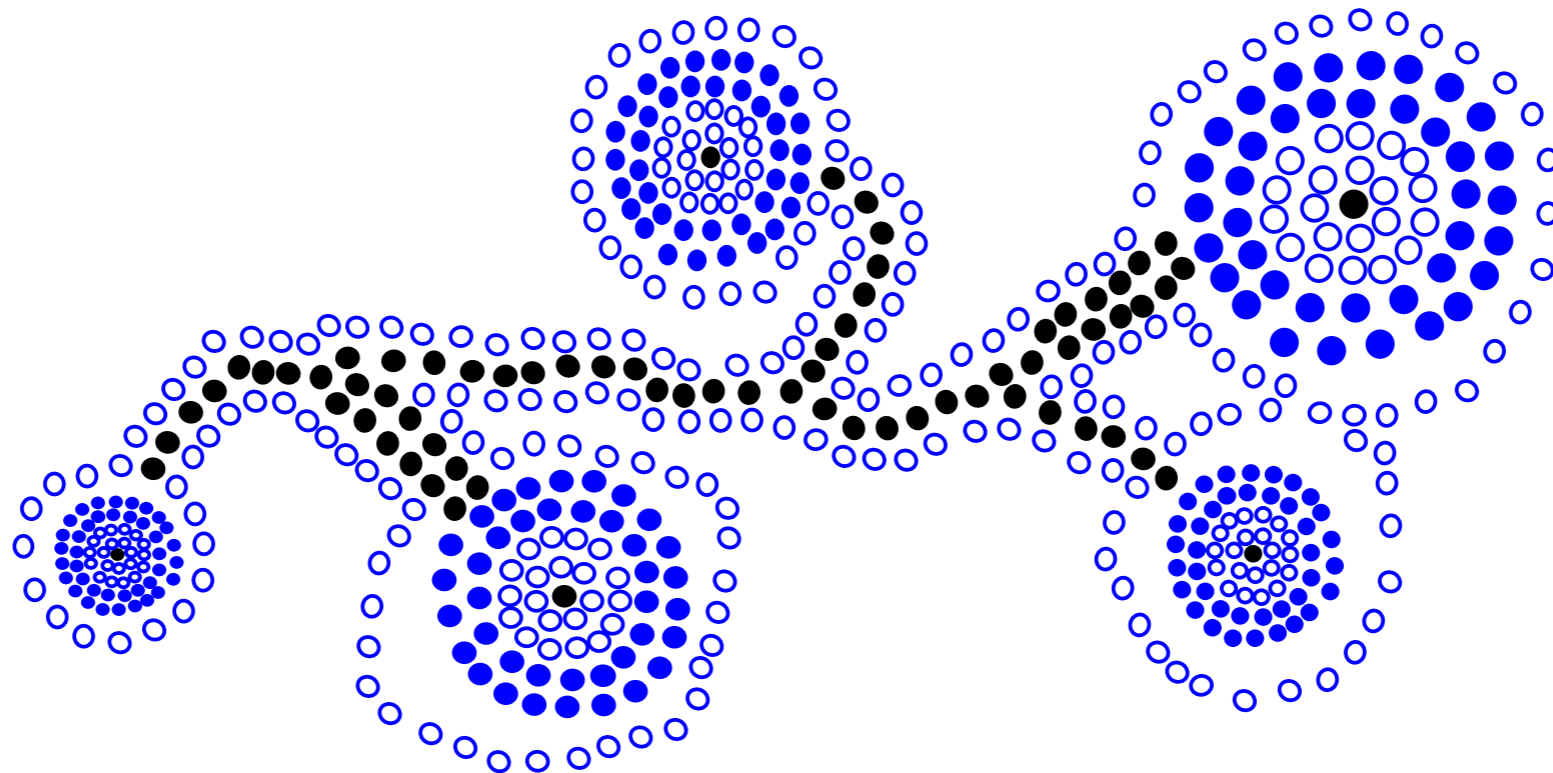
# End of Downheap



- *Downheap* terminates when the key is greater than the keys of both its children **or** the bottom of the heap is reached.
- (total #swaps)  $\leq (h - 1)$ , which is  $O(\log n)$

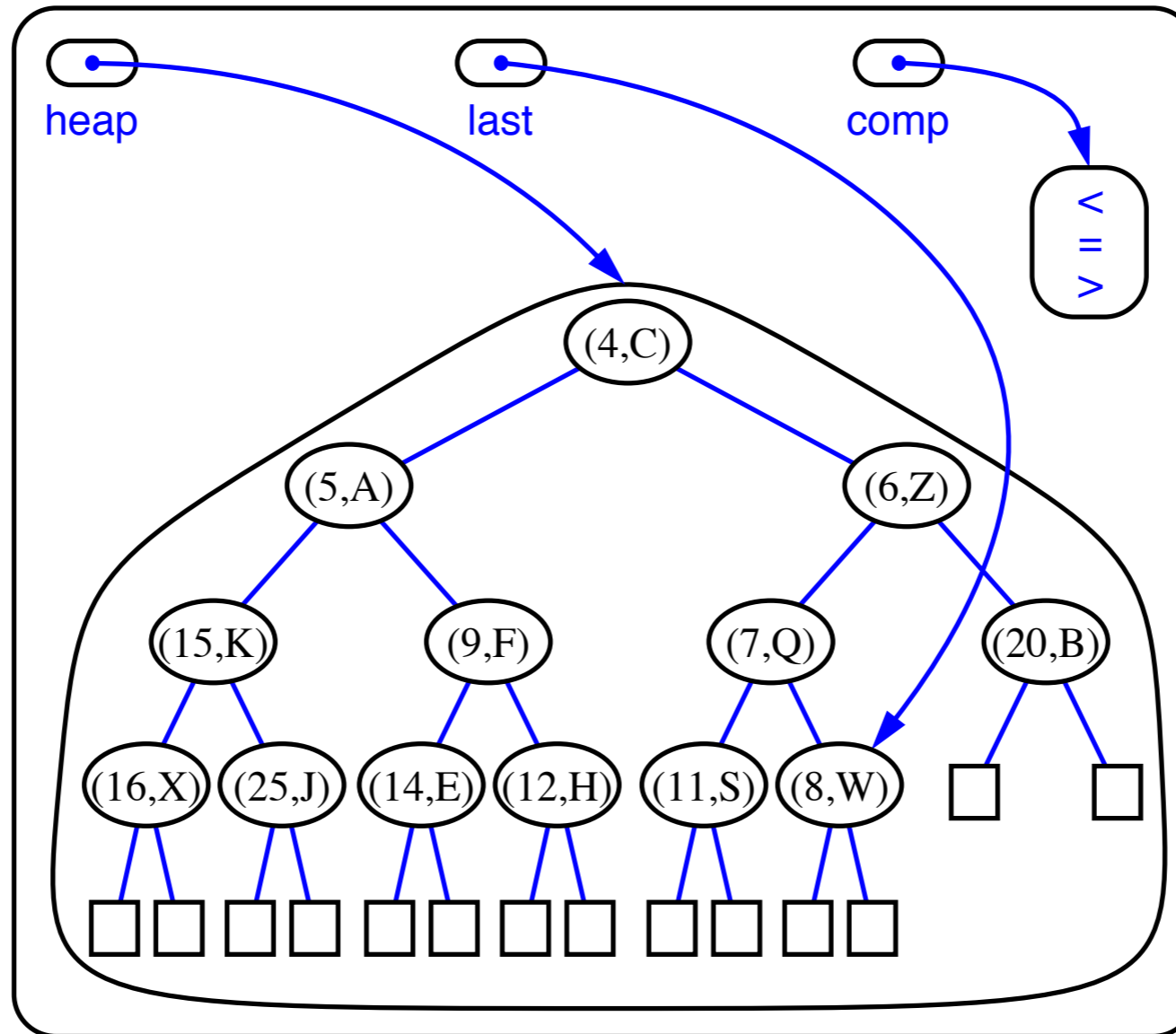
# HEAPS II

- Implementation
- HeapSort
- Bottom-Up Heap Construction
- Locators



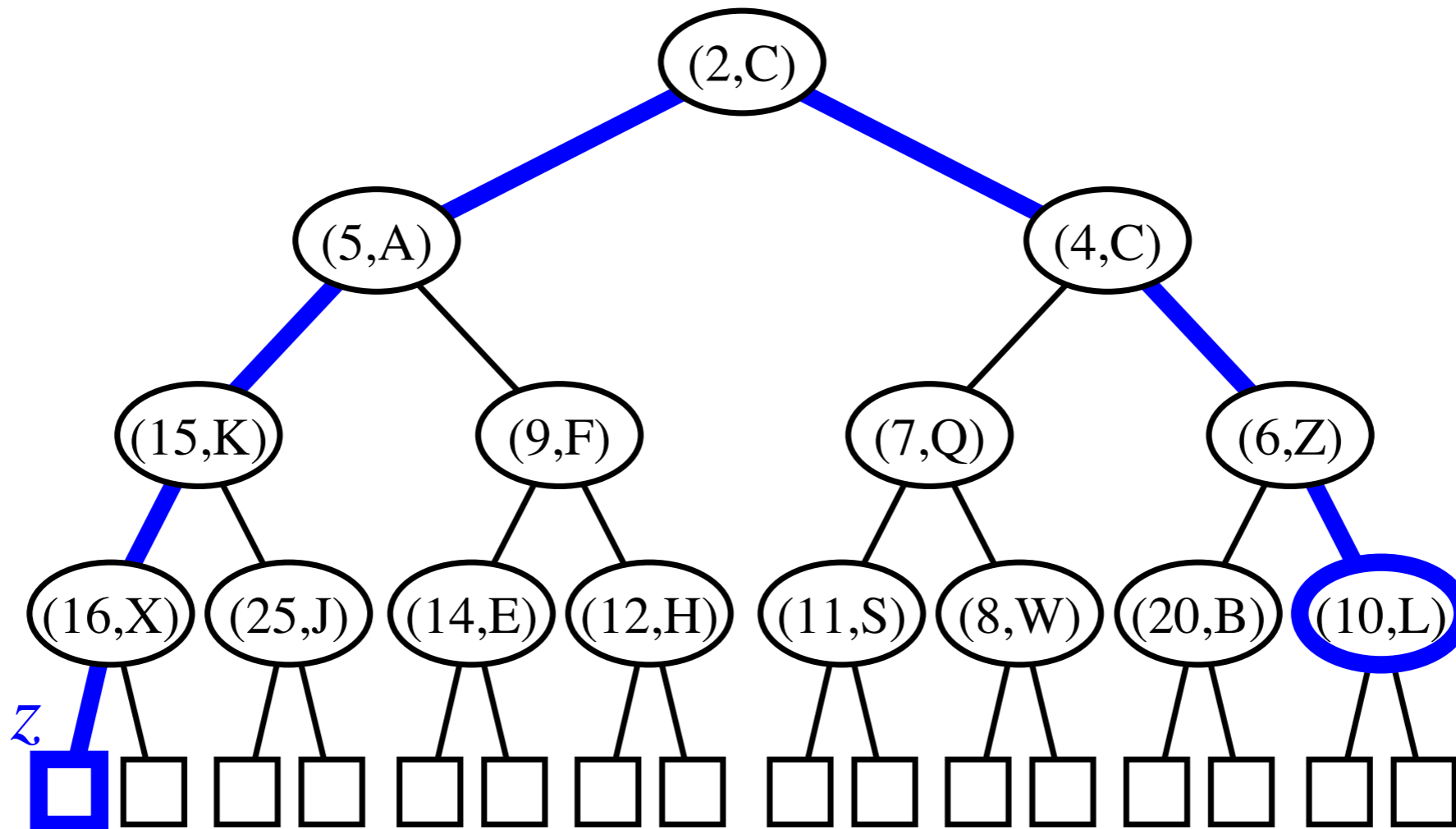
# Implementation of a Heap

```
public class HeapPriorityQueue implements PriorityQueue
{
    BinaryTree T;
    Position last;
    Comparator comparator;
    ...
}
```



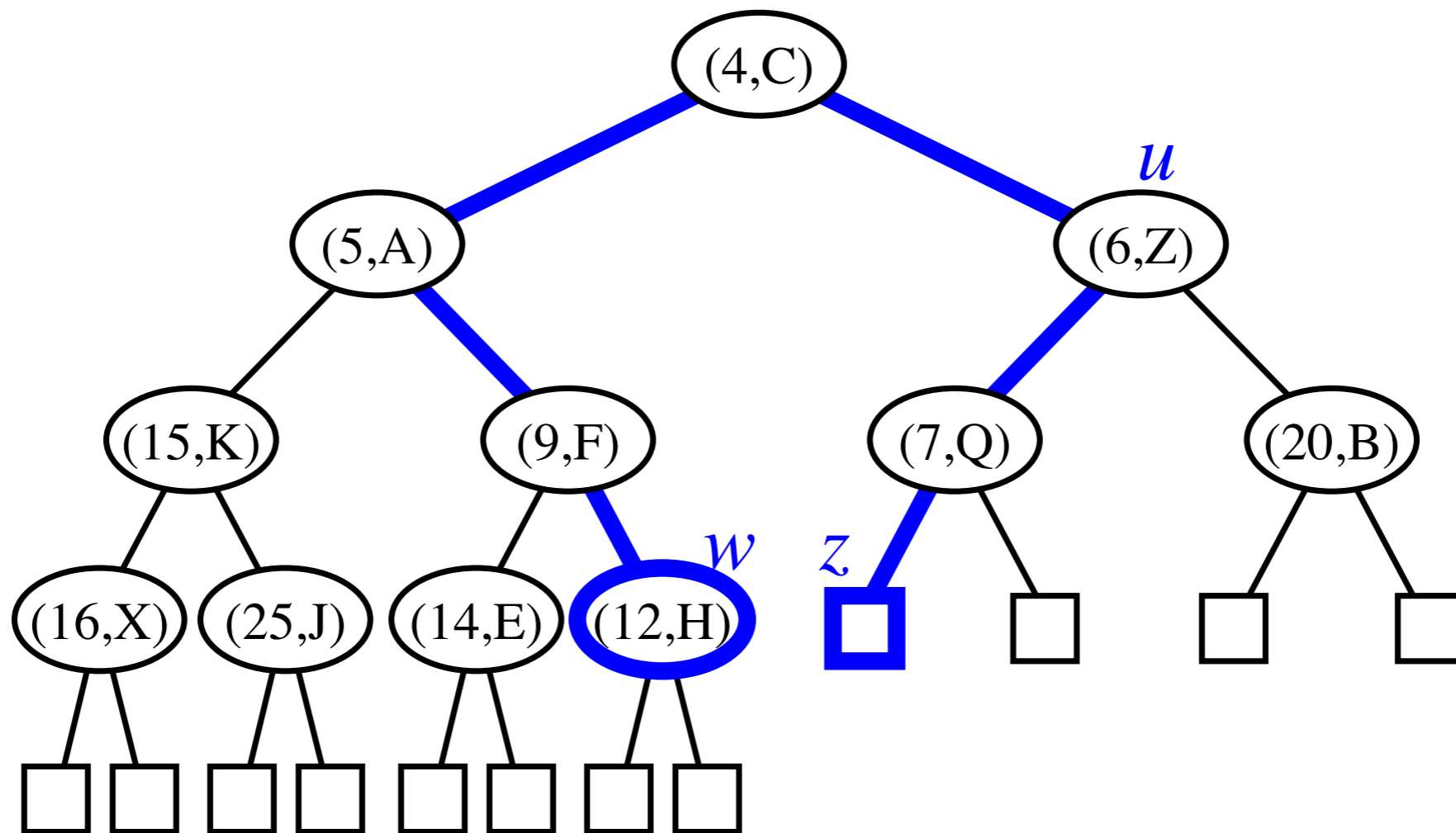
# Implementation of a Heap(cont.)

- Two ways to find the insertion position  $z$  in a heap:



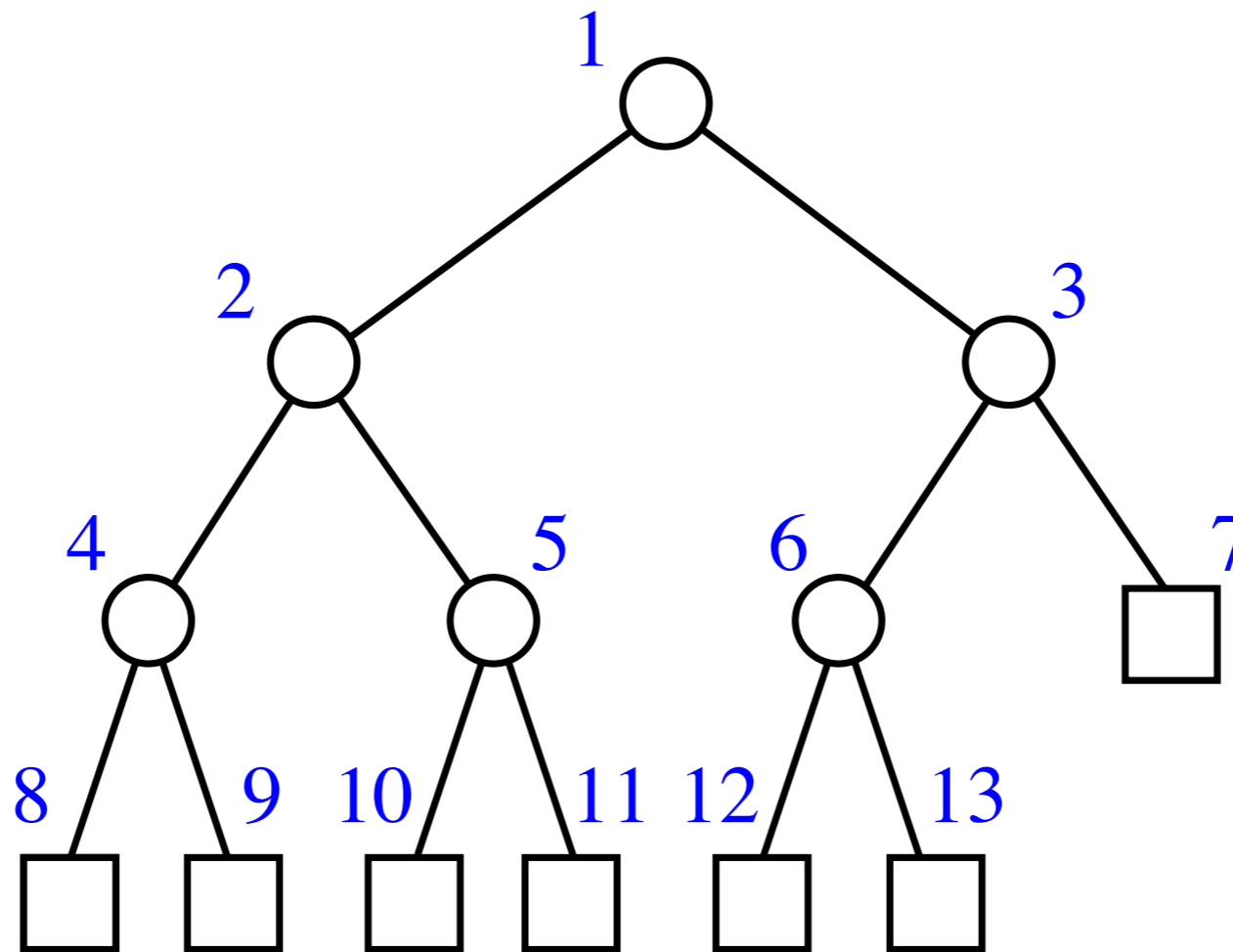
# Implementation of a Heap(cont.)

- Two ways to find the insertion position  $z$  in a heap:

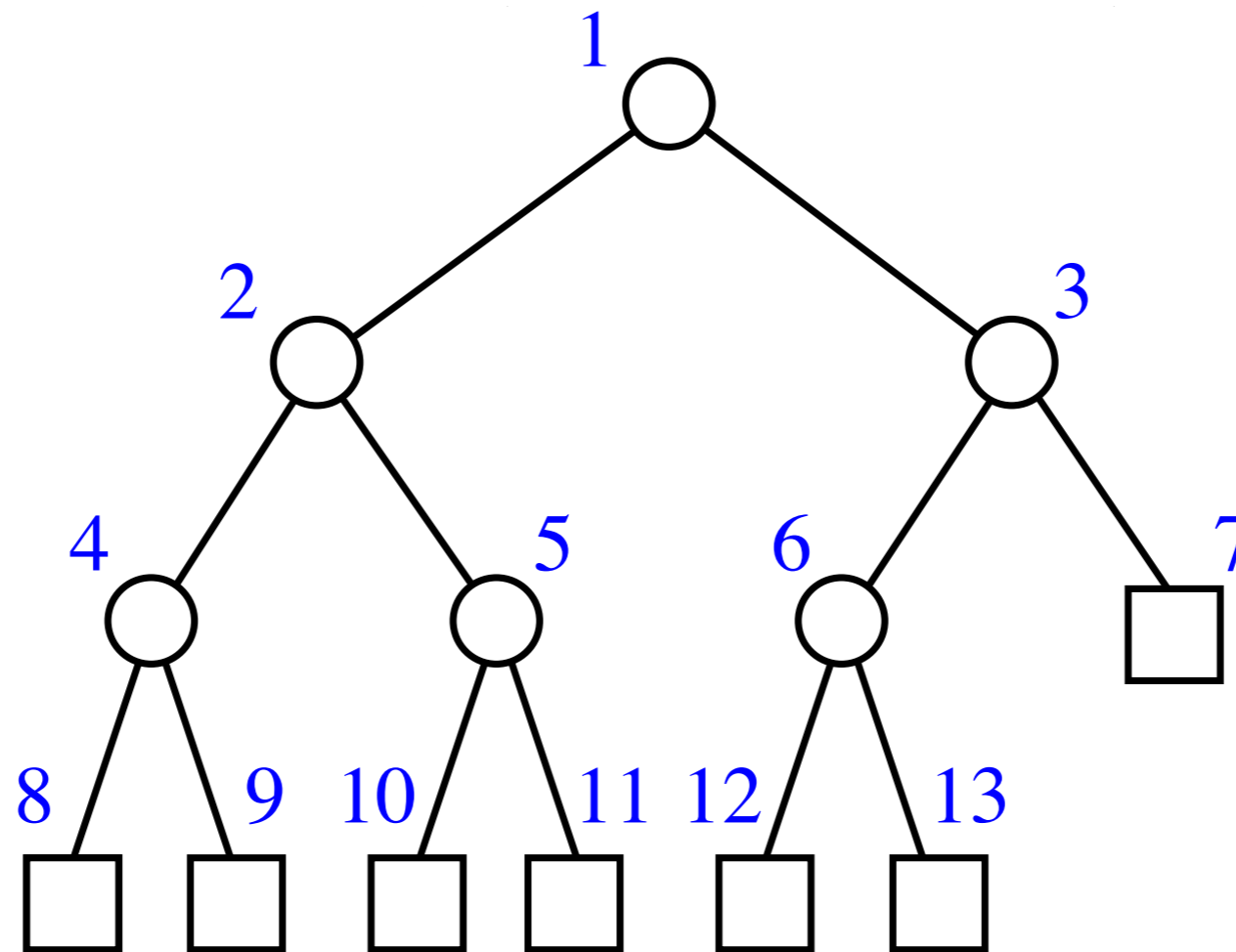


# Vector Based Implementation

- Updates in the underlying tree occur only at the “last element”
- A heap can be represented by a vector, where the node at rank  $i$  has
  - left child at rank  $2i$  and
  - right child at rank  $2i + 1$



# Vector Based Implementation



- The leaves do not need to be explicitly stored
- Insertion and removals into/from the heap correspond to **insertLast** and **removeLast** on the vector, respectively



# Heap Sort

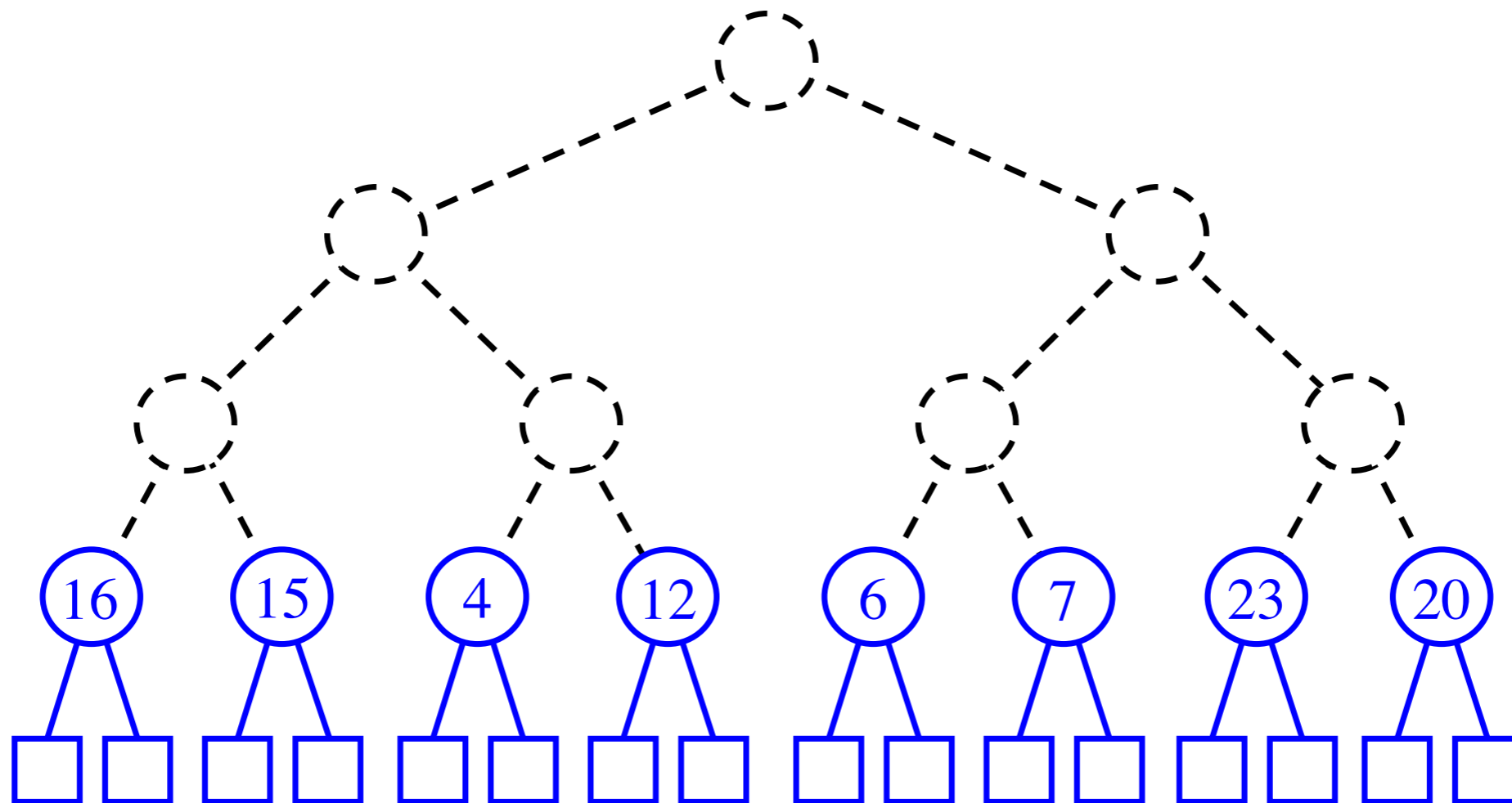
- All heap methods run in logarithmic time or better
- If we implement PriorityQueueSort using a heap for our priority queue, `insertItem` and `removeMin` each take  $O(\log k)$ ,  $k$  being the number of elements in the heap at a given time.
- We always have at most  $n$  elements in the heap, so the worst case time complexity of these methods is  $O(\log n)$ .
- Thus each phase takes  $O(n \log n)$  time, so the algorithm runs in  $O(n \log n)$  time also.
- This sort is known as *heap-sort*.
- The  $O(n \log n)$  run time of heap-sort is much better than the  $O(n^2)$  run time of selection and insertion sort.

## In-Place Heap-Sort

- Do not use an external heap
- Embed the heap into the sequence, using the vector representation

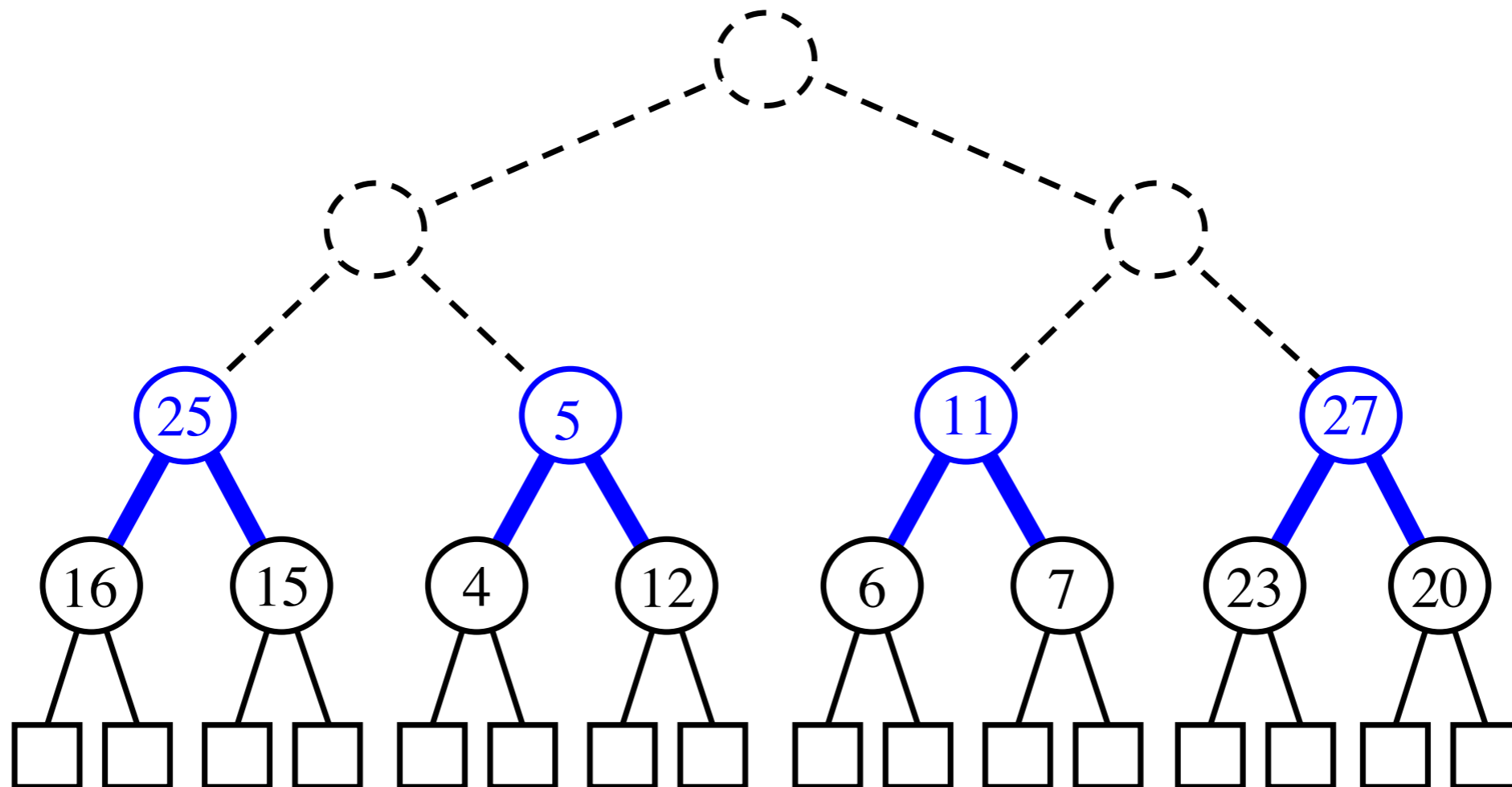
# Bottom-Up Heap Construction

- build  $(n + 1)/2$  trivial one-element heaps



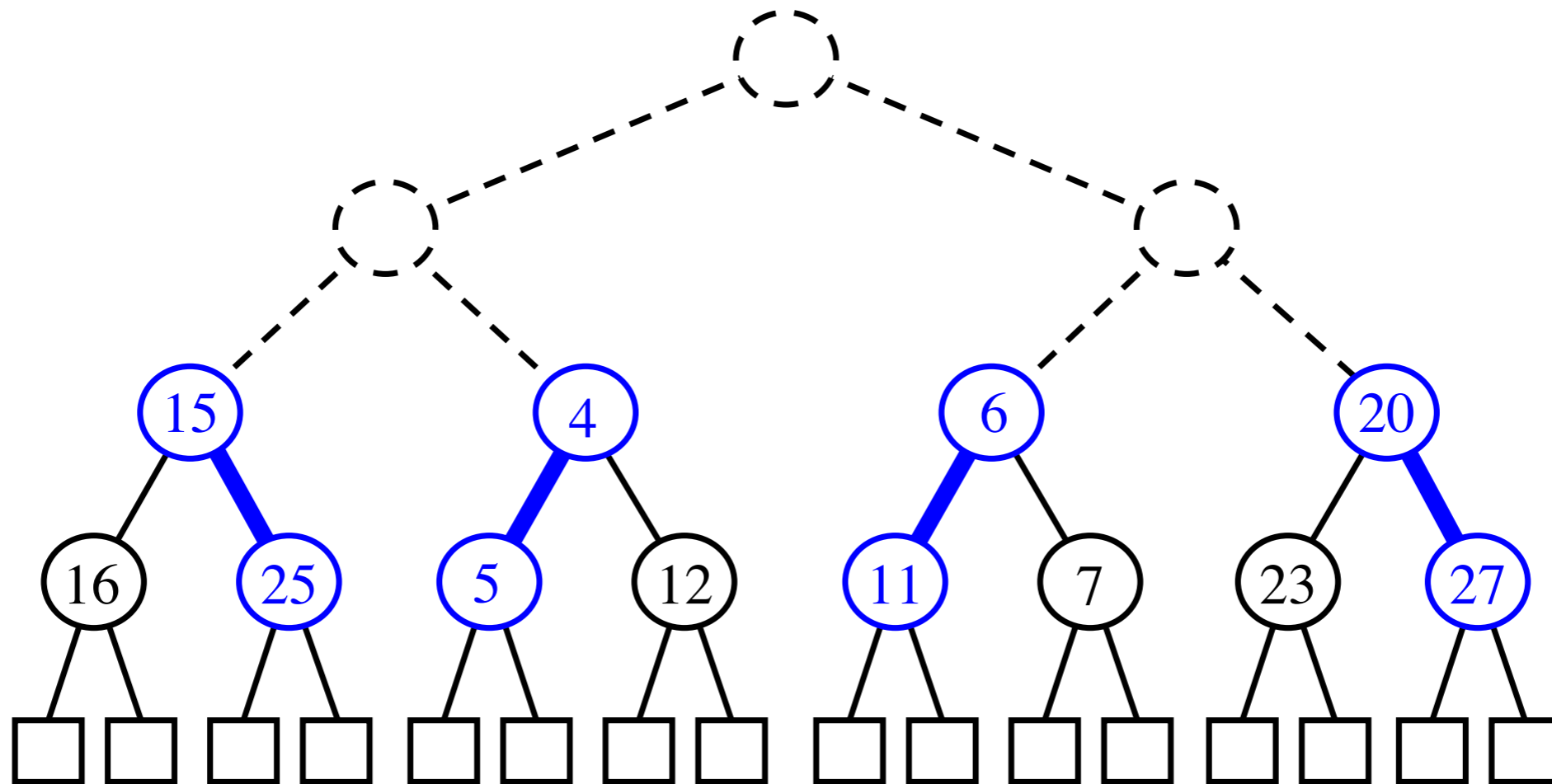
# Bottom-Up Heap Construction

- now build three-element heaps on top of them



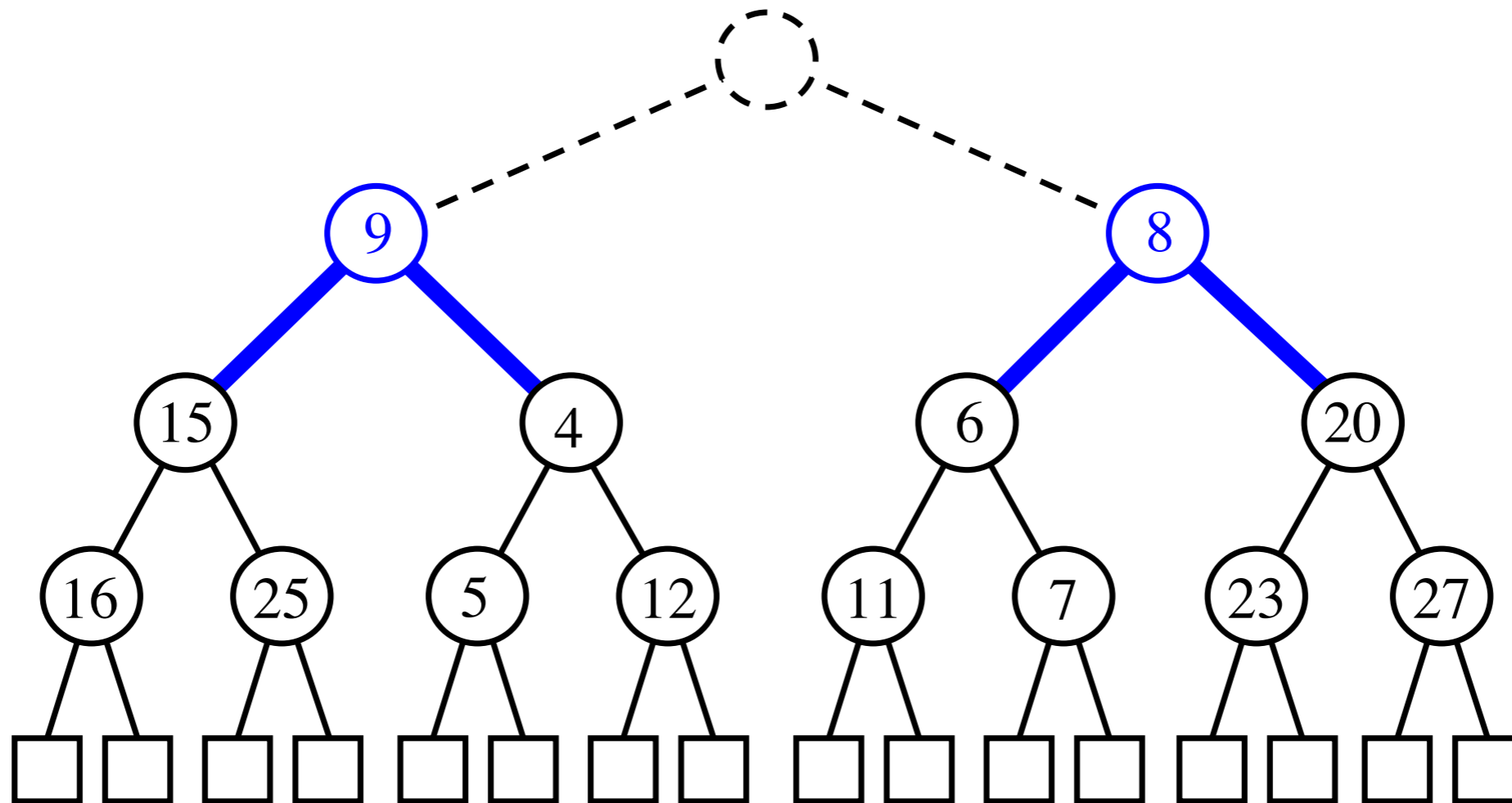
# Bottom-Up Heap Construction

- *downheap* to preserve the order property

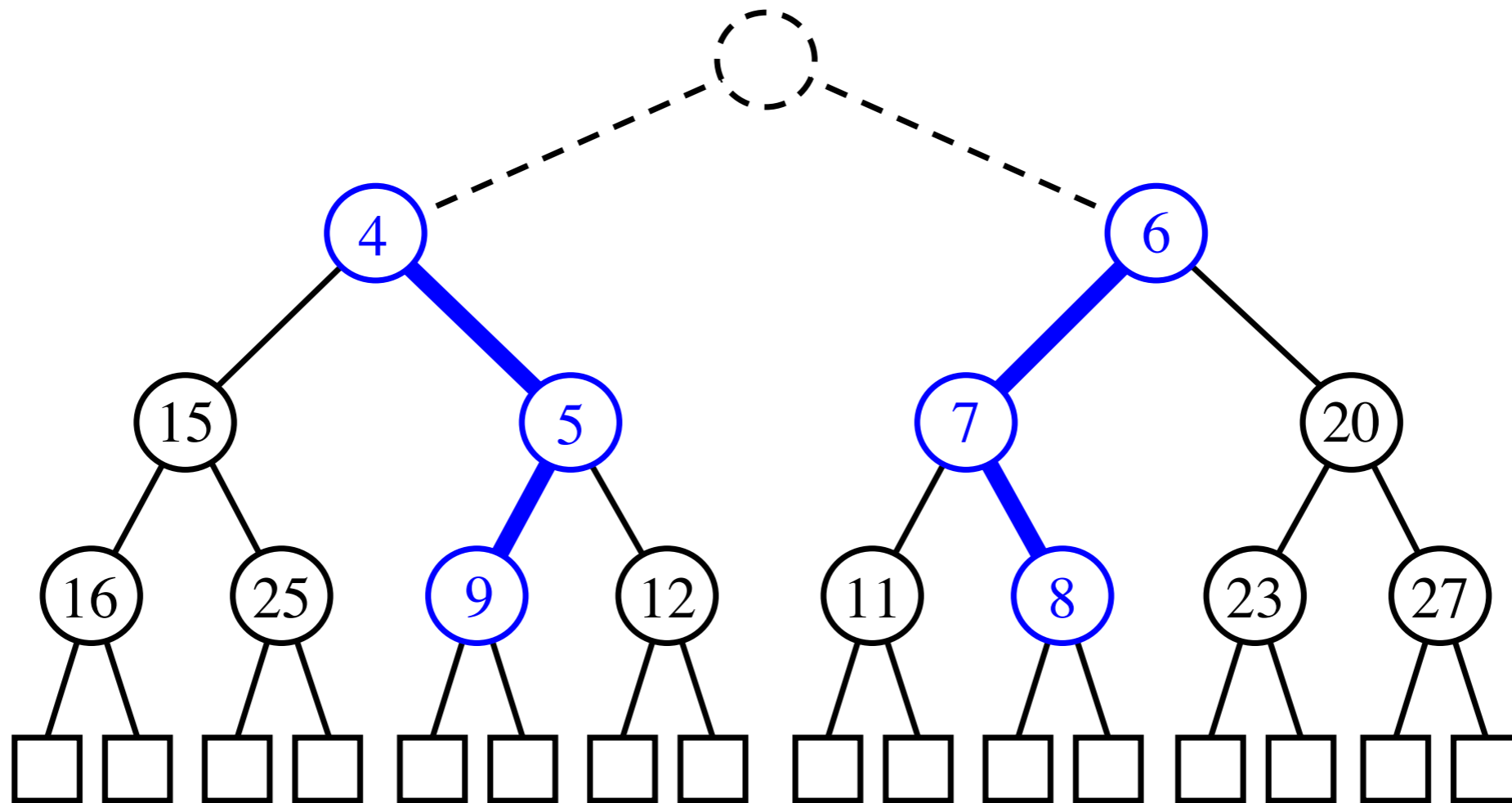


# Bottom-Up Heap Construction

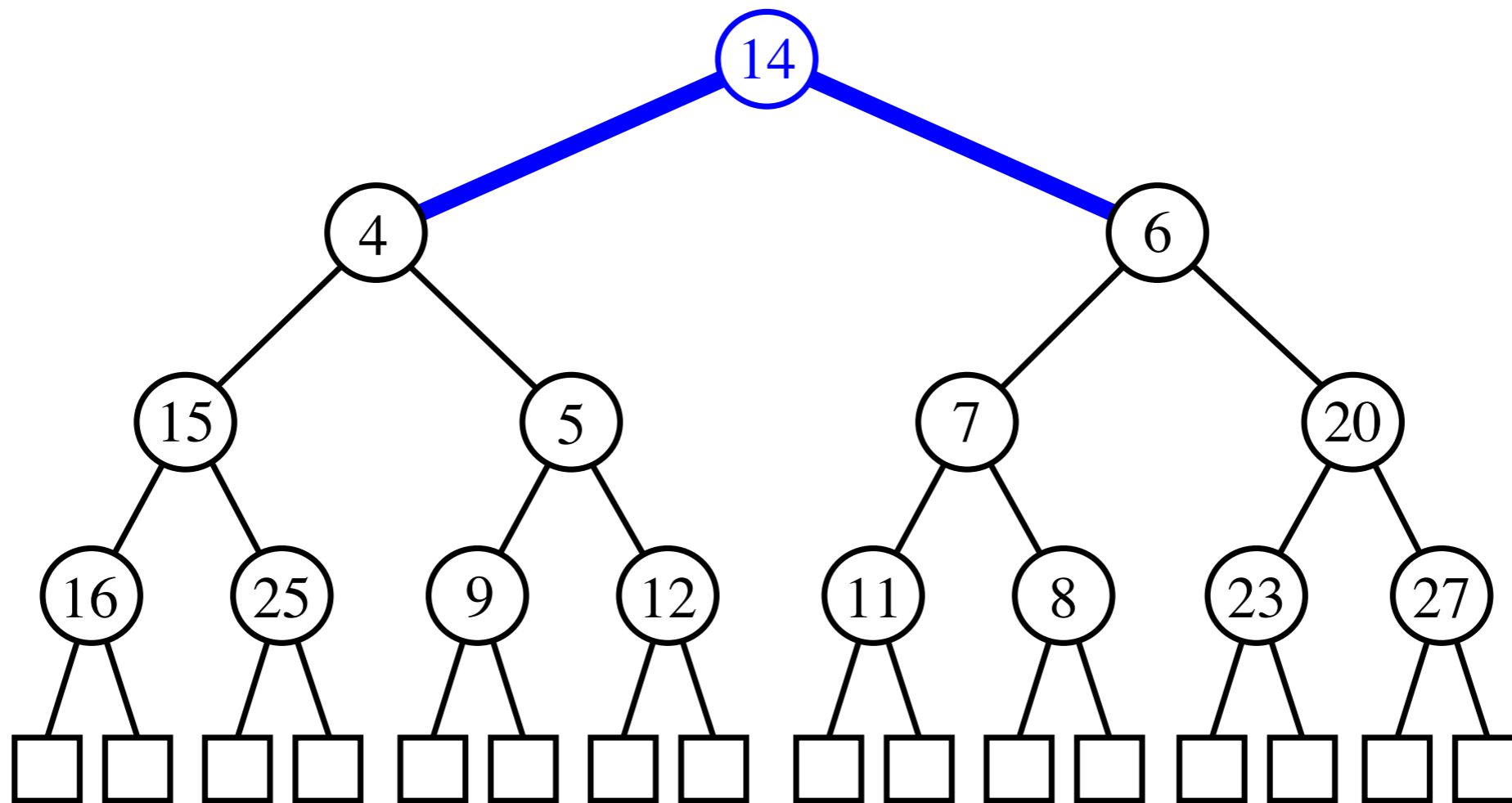
- now form seven-element heaps



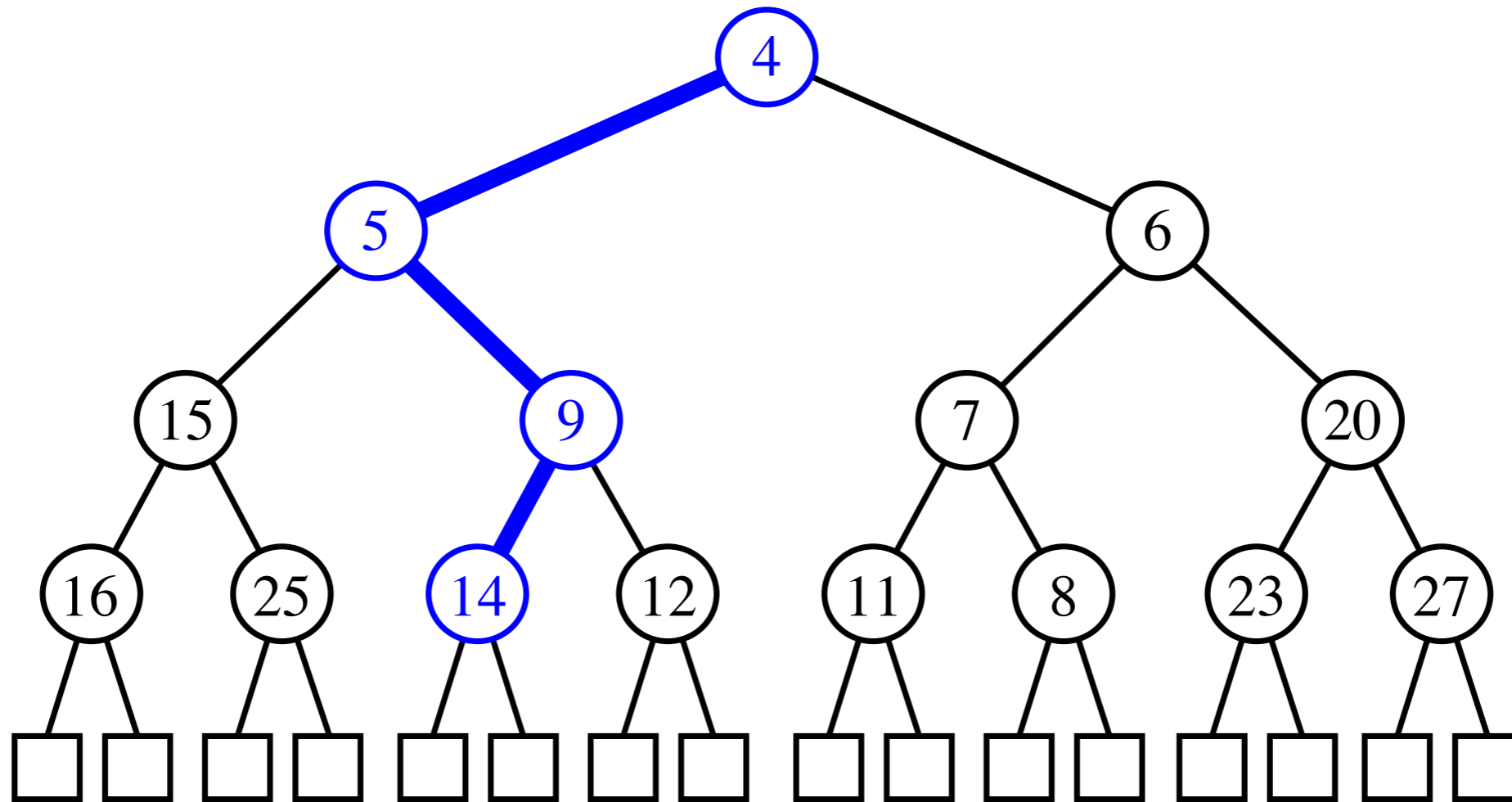
# Bottom-Up Heap Construction (cont.)



# Bottom-Up Heap Construction (cont.)



# Bottom-Up Heap Construction (cont.)

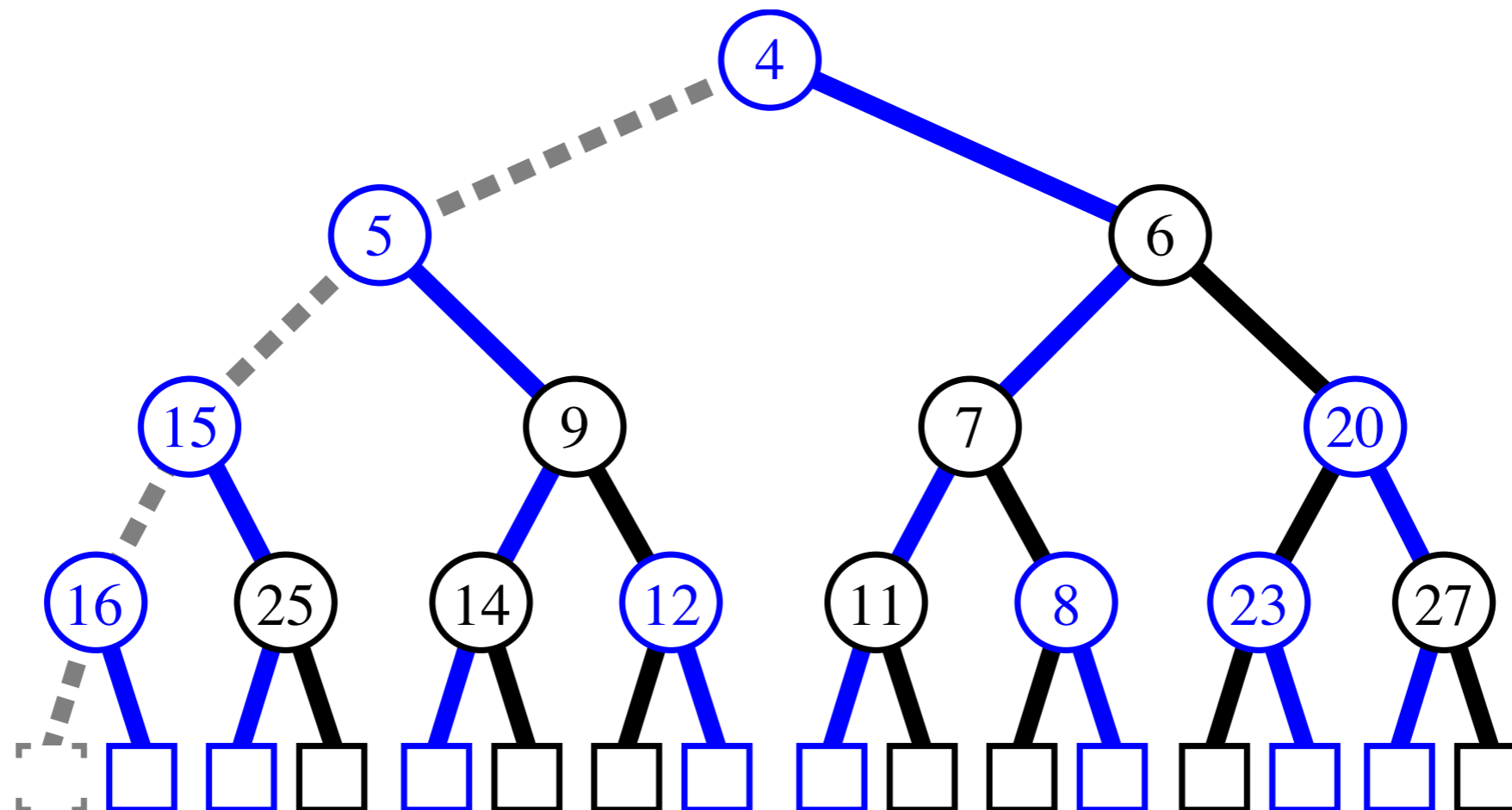


**The End**



# Analysis of Bottom-Up Heap Construction

- **Proposition:** Bottom-up heap construction with  $n$  keys takes  $O(n)$  time.
  - Insert  $(n + 1)/2$  nodes
  - Insert  $(n + 1)/4$  nodes and downheap them
  - Insert  $(n + 1)/8$  nodes and downheap them
  - ...



- $n$  inserts,  $n/2$  upheaps with total  $O(n)$  running time

INTRODUCTION TO  
**ALGORITHMS**

SECOND EDITION

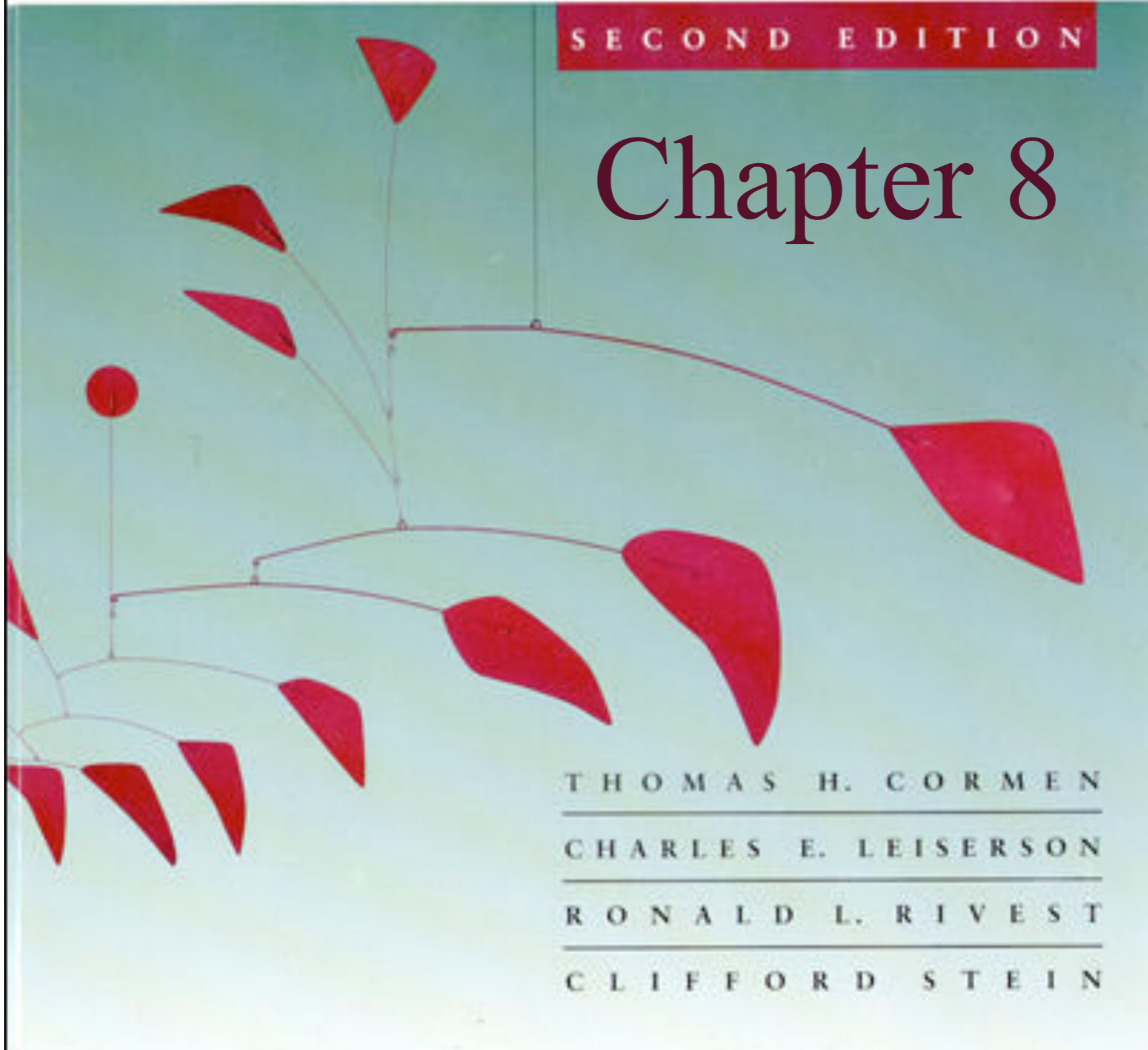
Chapter 8

THOMAS H. CORMEN

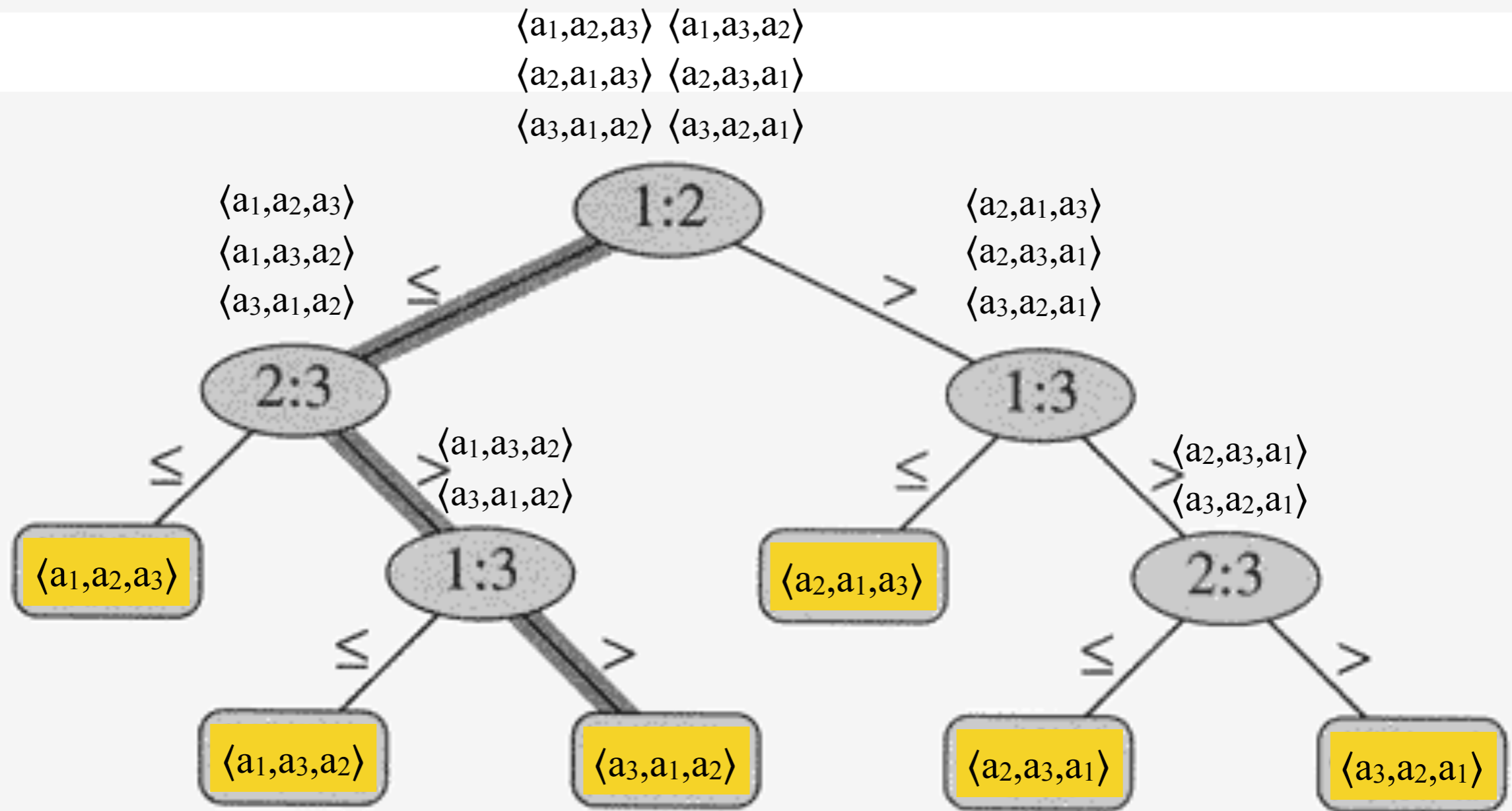
CHARLES E. LEISERSON

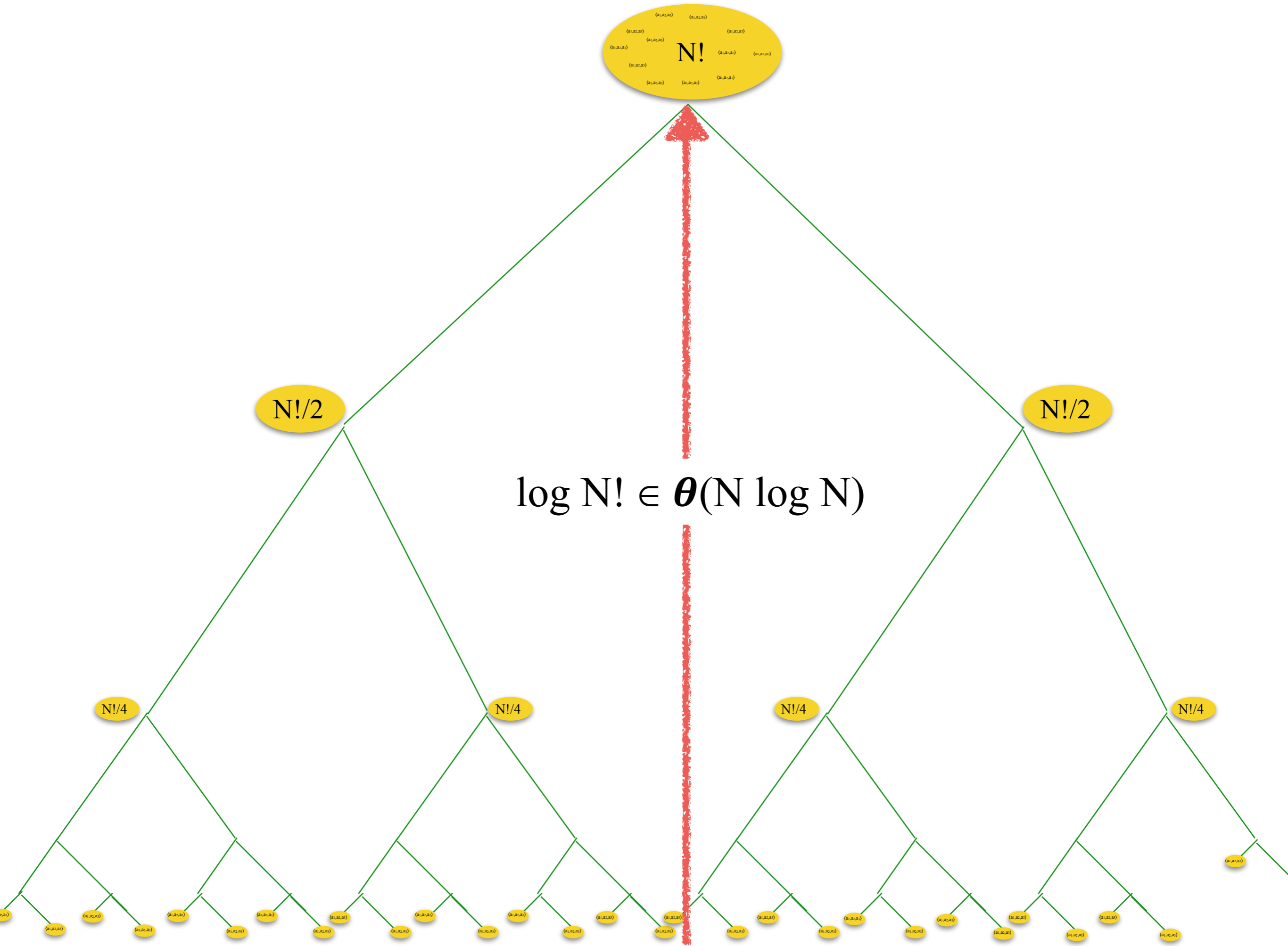
RONALD L. RIVEST

CLIFFORD STEIN



**Figure 8.1** The decision tree for insertion sort operating on three elements. An internal node annotated by  $i:j$  indicates a comparison between  $a_i$  and  $a_j$ . A leaf annotated by the permutation  $\langle \pi(1), \pi(2), \dots, \pi(n) \rangle$  indicates the ordering  $a_{\pi(1)} \leq a_{\pi(2)} \leq \dots \leq a_{\pi(n)}$ . The shaded path indicates the decisions made when sorting the input sequence  $\langle a_1 = 6, a_2 = 8, a_3 = 5 \rangle$ ; the permutation  $\langle 3, 1, 2 \rangle$  at the leaf indicates that the sorted ordering is  $a_3 = 5 \leq a_1 = 6 \leq a_2 = 8$ . There are  $3! = 6$  possible permutations of the input elements, so the decision tree must have at least 6 leaves.





$N!$

$N!/2$

$N!/2$

$N!/4$

$N!/4$

$N!/4$

$N!/4$

$\log N! \in \Theta(N \log N)$

**Winter 2016**  
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Lecture 20, March 24, 2016



**Hardik**



**Omar**



**Faiz**



**Lekan**



**Faizy**



**Chris  
DoYeon**



**David B.**



**David B.R.**