


《数据结构与算法》课程组
重庆大学计算机学院



Data Structures & Algorithms





HEAP AND HEAP SORT



Outline

12.1 Heap

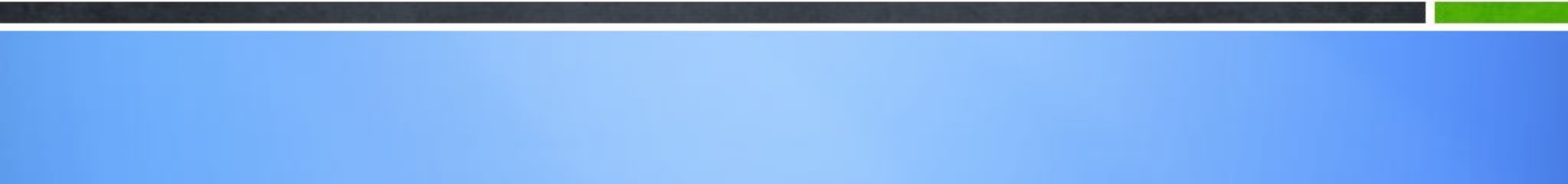
12.2 Heap Application

12.3 Heapsort

12.4 Comparison of Sorting Algorithms



12.1 Heap



Heaps

- **Definitions of “Heap”**
 - **1. A large area of memory from which the programmer can allocate blocks as needed, and deallocate them when no longer needed**
 - **2. A balanced, left-justified binary tree (or complete tree) in which no node has a value greater (or smaller) than the value in its parent**
- **Heapsort uses the second definition**

Balanced Binary Trees

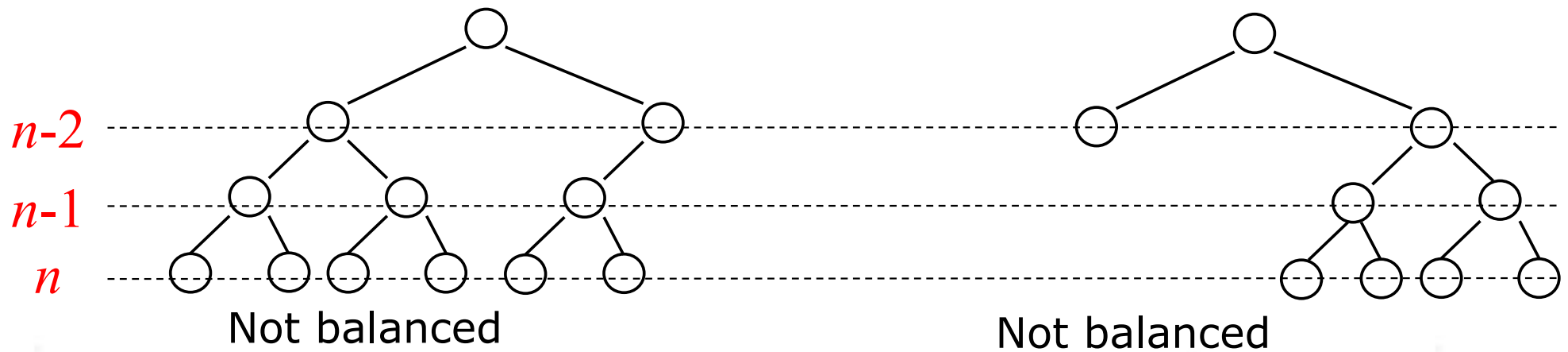
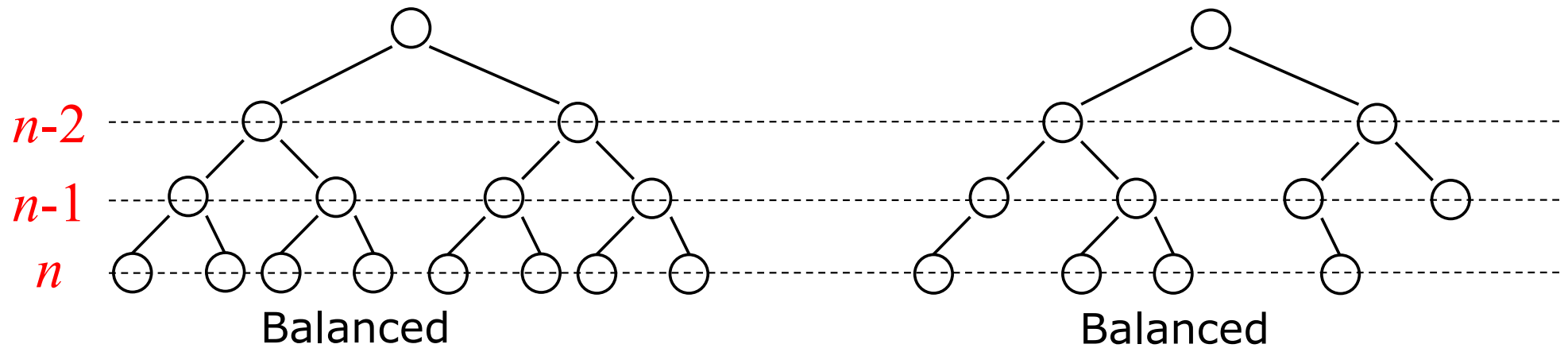
□ Recall the binary trees

- The **depth of a node** is its distance from the root

- The **depth of a tree** is the depth of the deepest node

- A binary tree of depth n is **balanced** if all the nodes at depths 0 through $n-2$ have two children (full!)

Example of Balanced Binary Trees



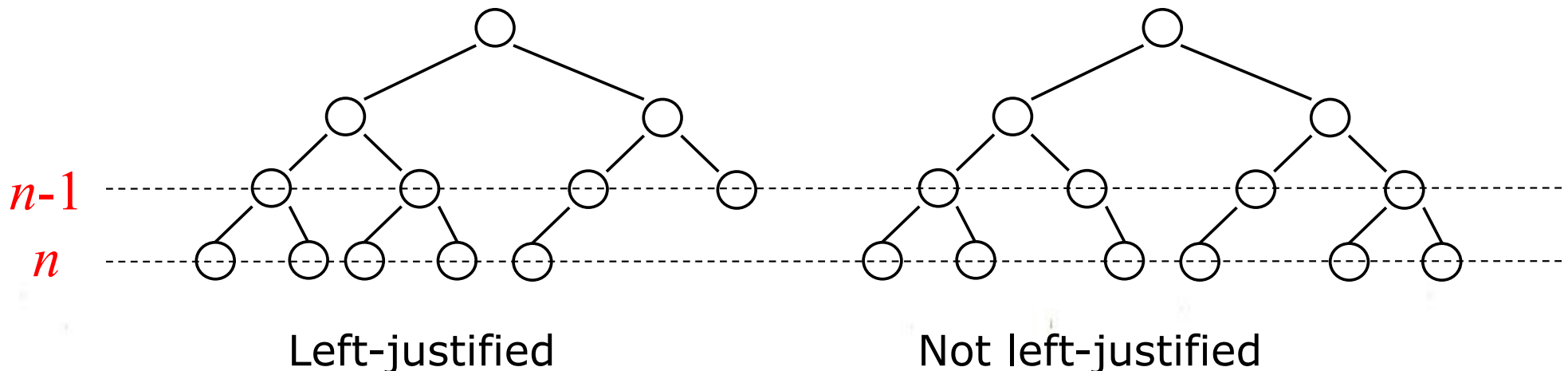
Left-justified Binary Trees (HEAP)

□ A balanced binary tree is **left-justified** if:

■ it has 2^n nodes at depth n (the tree is “full”)

or

■ all the leaves at depth n are to the left of all the nodes at depth $n-1$

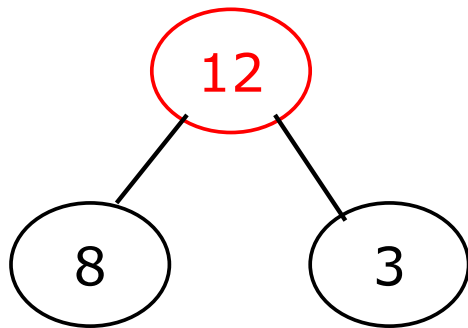


Heap

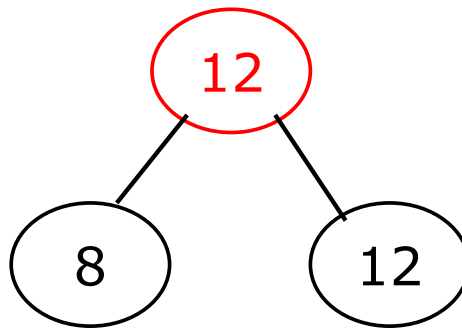
1. It is a left-justified (complete) binary tree
 - its height is guaranteed to be the minimum possible. In particular, a heap containing n nodes will have a height of $\lceil \log(n + 1) \rceil$
 2. the values stored in a heap are **partially ordered**. This means that there is **a relationship between the value stored at any node and the values of its children**.
 3. There are two variants of the heap, depending on the definition of this relationship:
 - **MinHeap: $\text{key}(\text{parent}) \leq \text{key}(\text{child})$**
 - **MaxHeap: $\text{key}(\text{parent}) \geq \text{key}(\text{child})$**
- Note : there is no necessary relationship between the value of a node and that of its sibling in either the min-heap or the max-heap.

The Max Heap

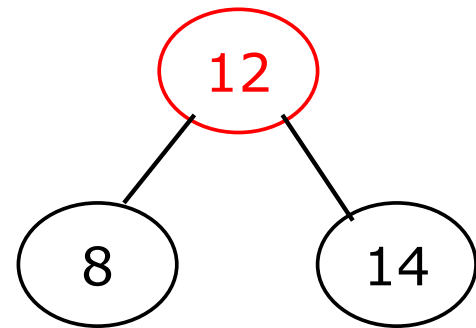
- A heap where the maximum element is at the top of the heap and the next to be popped.
 - **The max-heap property:** the value in the node is as large as or larger than the values in its children.



Red node has the max-heap property



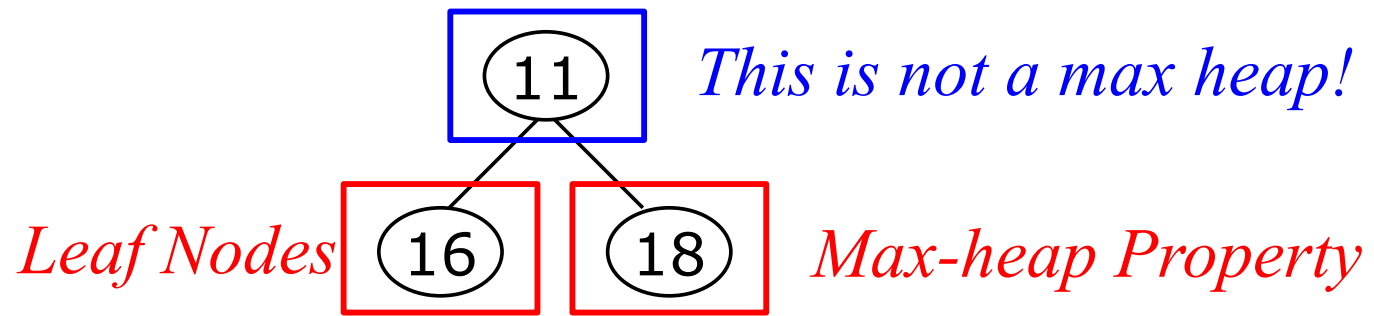
Red node has the max heap property



Red node does not have the max heap property

The Max-heap Property

- All leaf nodes automatically have the heap property



- A binary tree is a max-heap if all nodes in it have the max-heap property

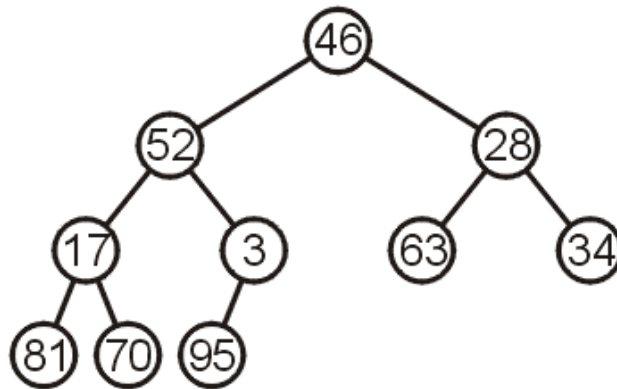


Constructing a Max-heap

- Consider this unsorted array with starting index at **1**:

46	52	28	17	3	63	34	81	70	95
----	----	----	----	---	----	----	----	----	----

- We can transform this array into the following complete tree:



*This is NOT
a max-heap*

- Where for each node:

- The children of the **k -th** element are the **$2k$ -th** and **$2k+1$ -th** elements
- The parent node of the **k -th** element is the **$\lfloor k/2 \rfloor$**

- **HOW TO TRANSFORM** this array into a max-heap?

Siftup operation

```
void siftup(int p) {  
    while(p > 1) {  
        if(Comp::prior(Heap[p], Heap[p/2])) {  
            swap(Heap[p], Heap[p/2]);  
            p = p / 2;  
        } else {  
            break;  
        }  
    }  
}
```

//Heap[p]是需上升（前移）元素
// p不是根位置
//比父节点优先
//与父节点交换
//移到父节点位置，继续上升
//如果父节点优先，结束上升

Time complexity = $O(\log(n))$

Building a heap (Top-down)

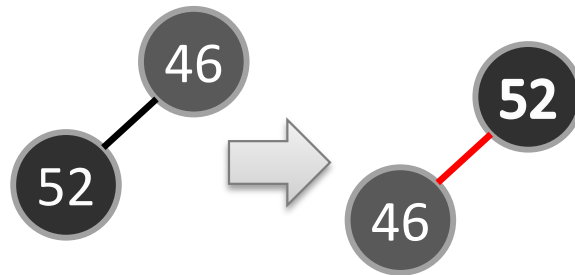
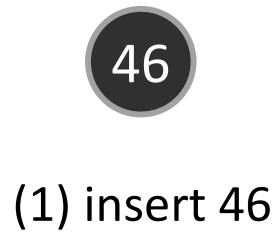
- Insert the elements one at a time. (similar to insertion sort)

```
//最大堆Heap[1..last], 插入新元素it
void insert(const E& it) {
    Assert(last < maxsize, "Heap is full");
    Heap[++last] = it; //新元素先放在堆最后
    siftup(last);      //向上移动
}
```

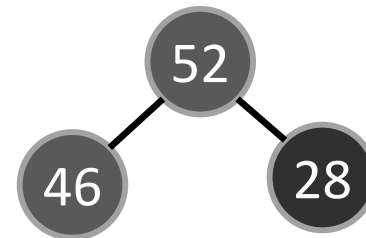
- Each call to insert takes $\Theta(\log(n))$ time in the worst case, because the value being inserted can move at most the distance from the bottom of the tree to the top of the tree.
- Thus, to insert n values into the heap, if we insert them one at a time, will take $\Theta(n \log(n))$ time in the worst case.

Building a heap (Top-down)

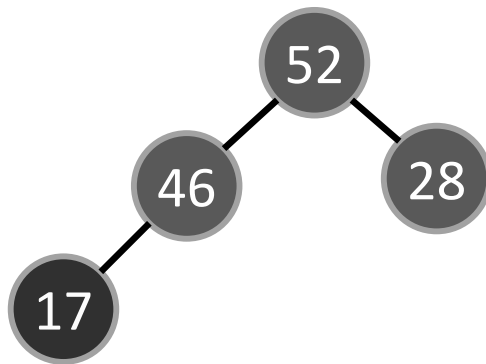
46	52	28	17	3	63	34	81	70	95
----	----	----	----	---	----	----	----	----	----



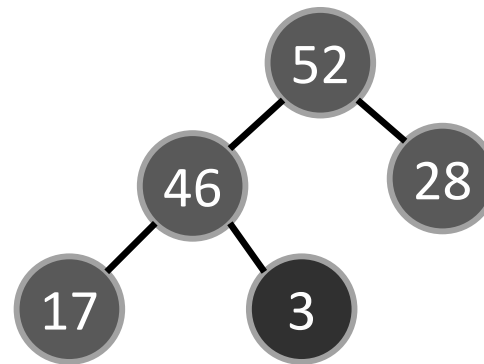
(2) insert 52



(3) insert 28



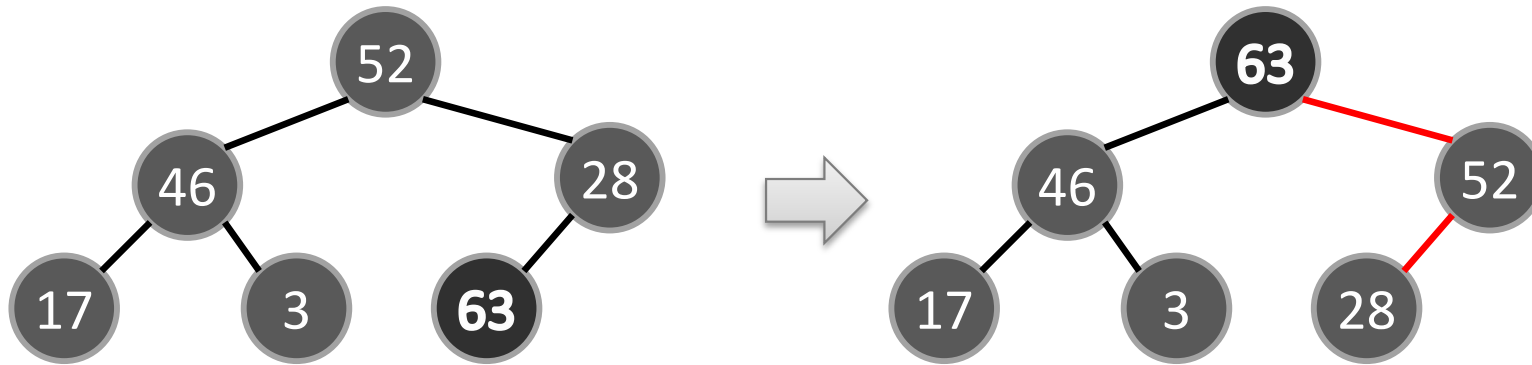
(4) insert 17



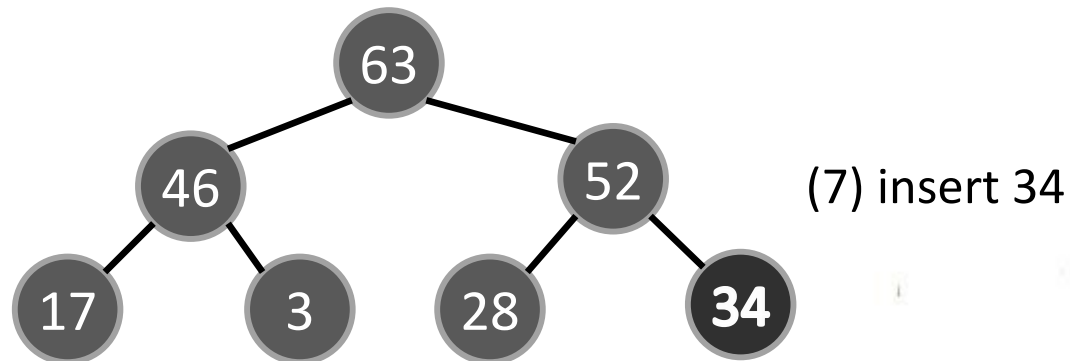
(5) insert 3

Building a heap (Top-down)

46	52	28	17	3	63	34	81	70	95
----	----	----	----	---	----	----	----	----	----



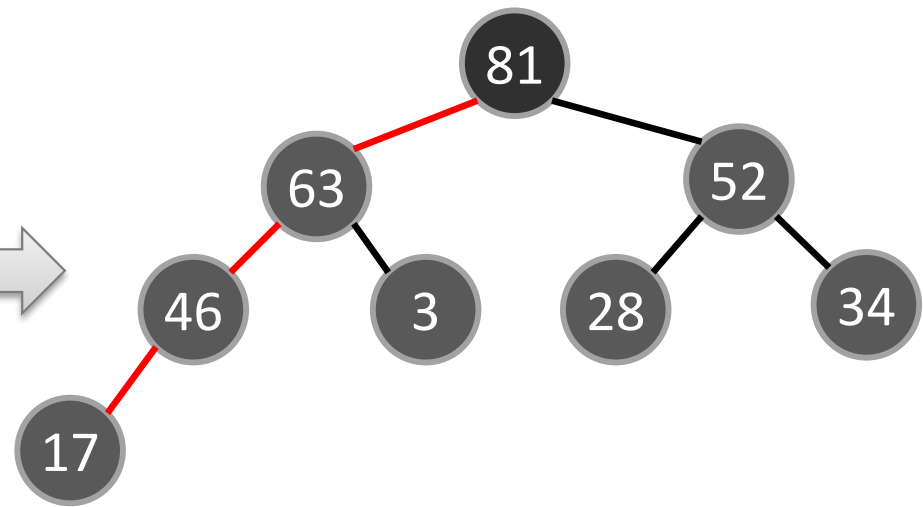
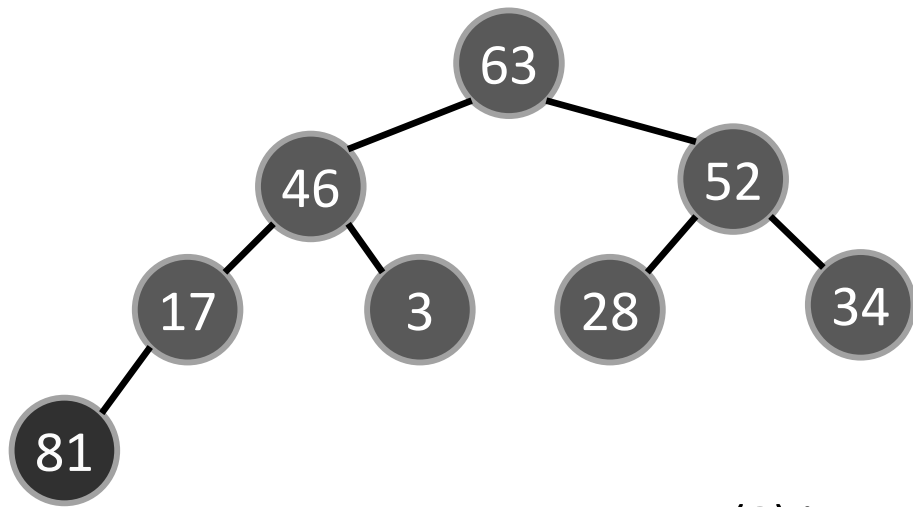
(6) insert 63



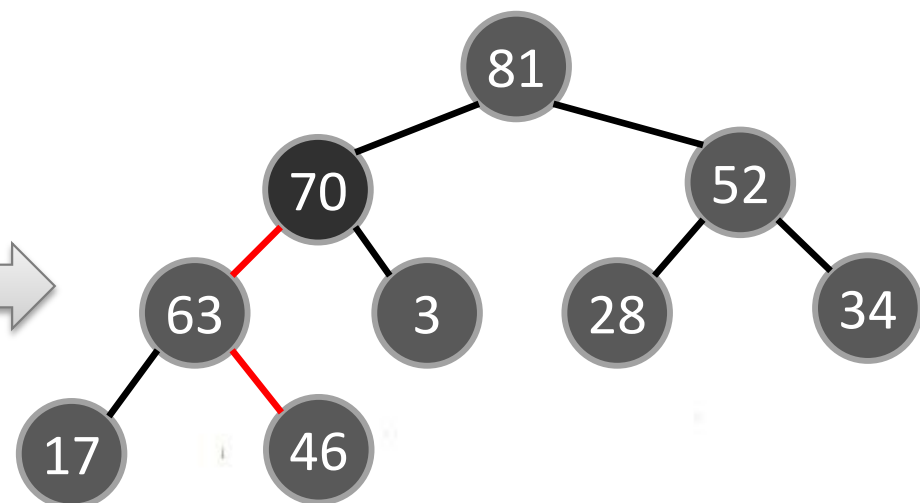
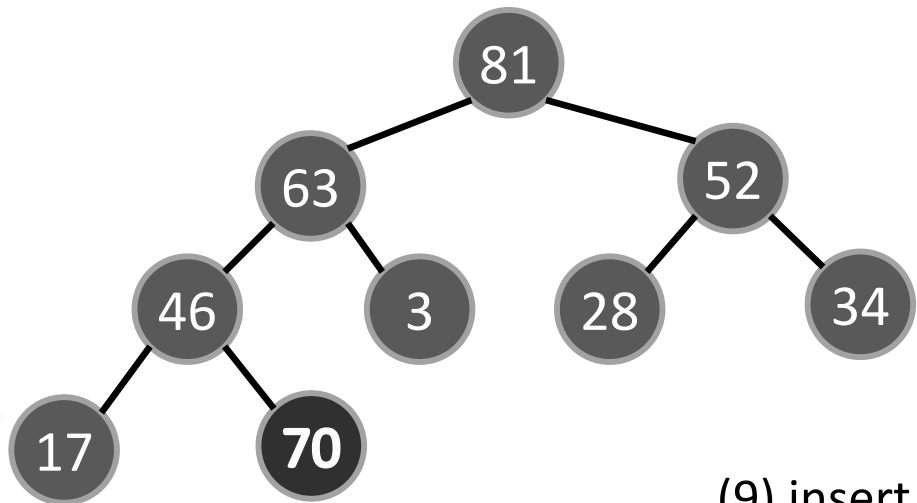
(7) insert 34

Building a heap (Top-down)

46	52	28	17	3	63	34	81	70	95
----	----	----	----	---	----	----	----	----	----

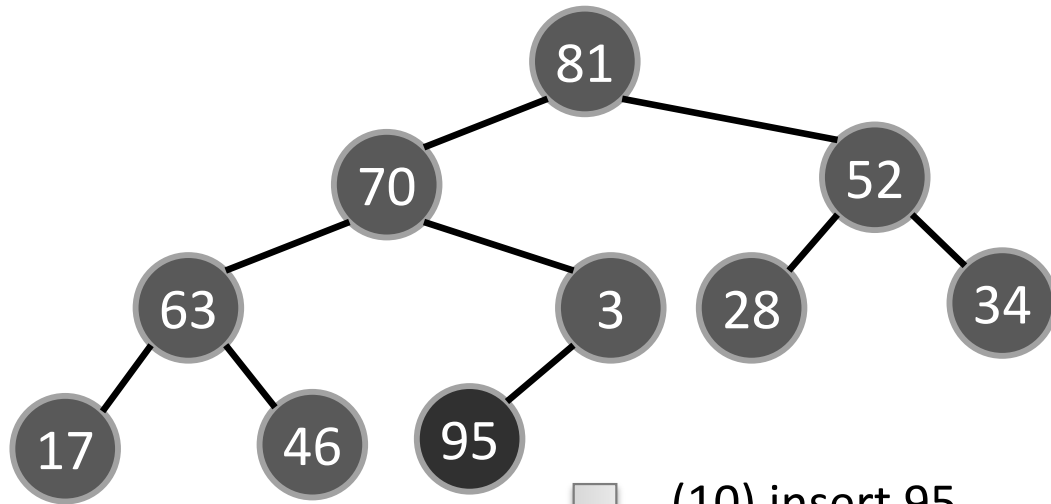


(8) insert 81

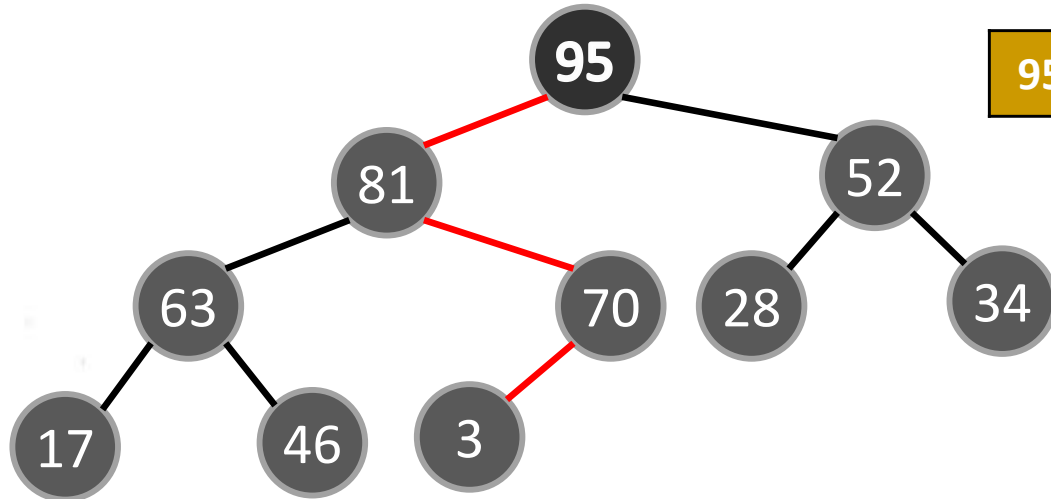


(9) insert 70

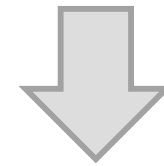
Building a heap (Top-down)



(10) insert 95



46	52	28	17	3	63	34	81	70	95
----	----	----	----	---	----	----	----	----	----



95	81	52	63	70	28	34	17	46	3
----	----	----	----	----	----	----	----	----	---

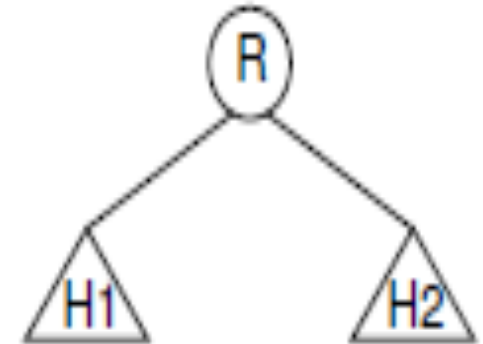
max heap

Building a heap (a faster way)

Suppose that the left and right subtrees of the root are already heaps, and R is the name of the element at the root. In this case there are two possibilities.

(1) $\text{Value}(R) \geq \text{Value}(\text{children})$: construction is complete.

(2) $\text{Value}(R) < \text{one or both of Value(children)}$: R should be exchanged with the child that has greater value.



– The result will be a heap, except that R might still be less than one or both of its (new) children.

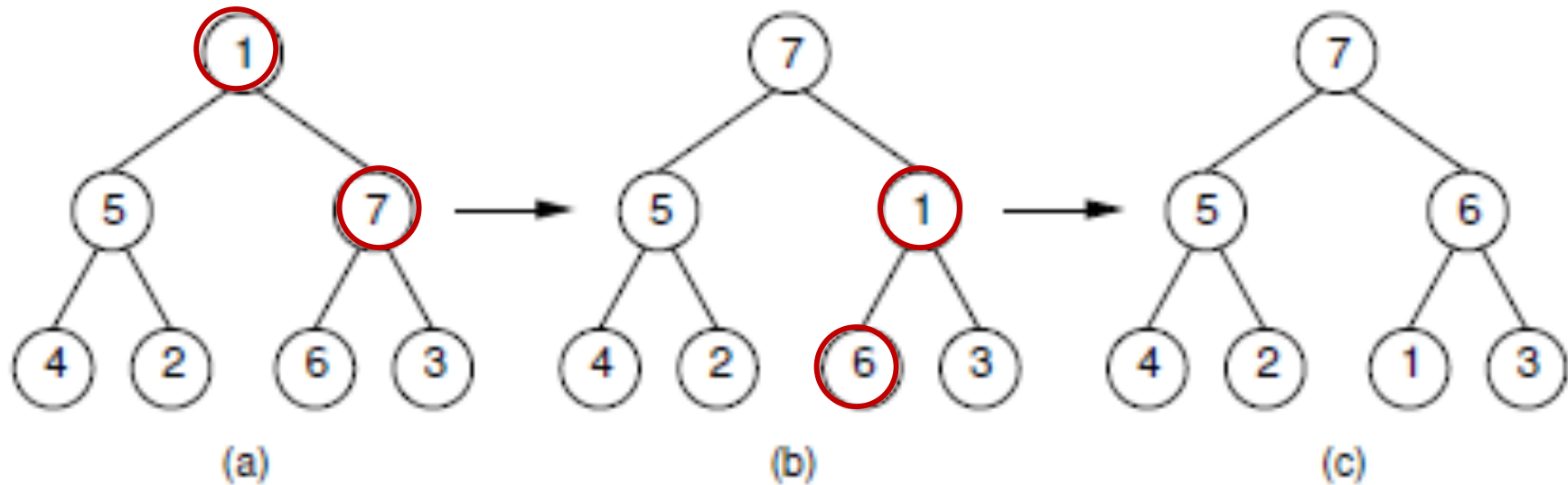
–In this case, we simply continue the process of “percolating down” R until it reaches a level where it is greater than its children, or is a leaf node. This process is implemented by the method **siftdown**.

Sift down operation

```
void sift down(int p) {  
    while(2*p <= last)           //Heap[p]是需下沉（后移）元素  
    {                             // p不是叶子  
        int cld = 2*p;           //p的左边子节点  
        if(cld < last && Comp::prior(Heap[cld+1], Heap[cld])  
            cld = cld + 1;        //右子节点不为空，取较优值  
  
        if(Comp::prior(Heap[cld], Heap[p])) { //子节点更优  
            swap(Heap[p], Heap[cld]);        //与子节点交换  
            p = cld;                          //移到子节点位置，继续下沉  
        }else{  
            break;                            //如果p比子节点优先，结束下沉  
        }  
    }  
}
```

Time complexity = $O(\log(n))$

Siftdown operation



The subtrees of the root are assumed to be heaps.

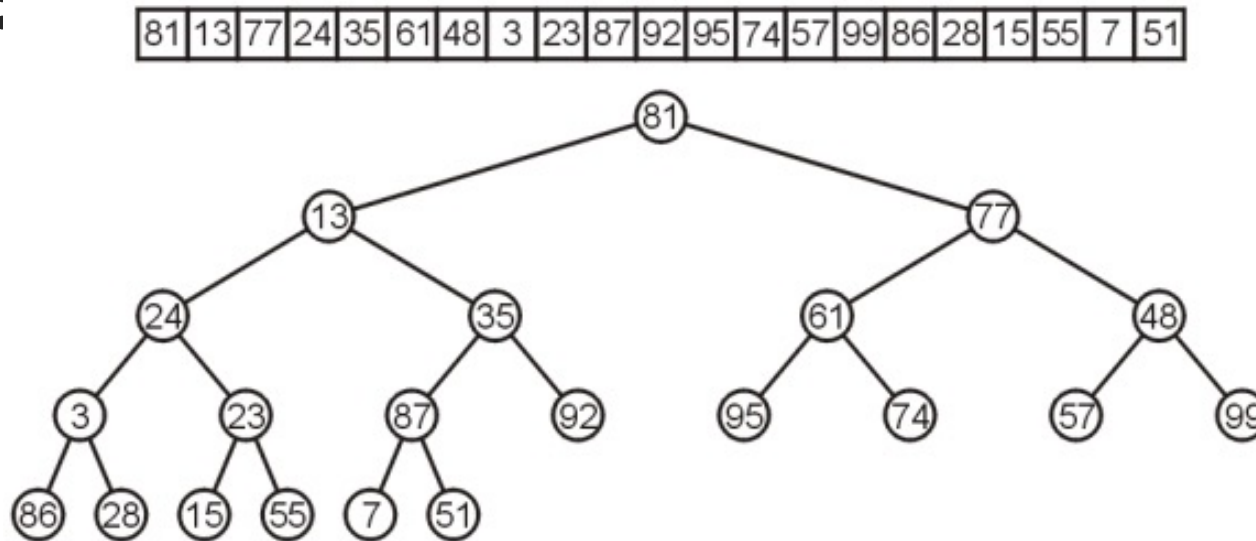
(a) The partially completed heap.

(b) Values 1 and 7 are swapped.

(c) Values 1 and 6 are swapped to form the final heap.

Building a heap (Bottom-up)

❑ To see if this can be done, consider the following array:

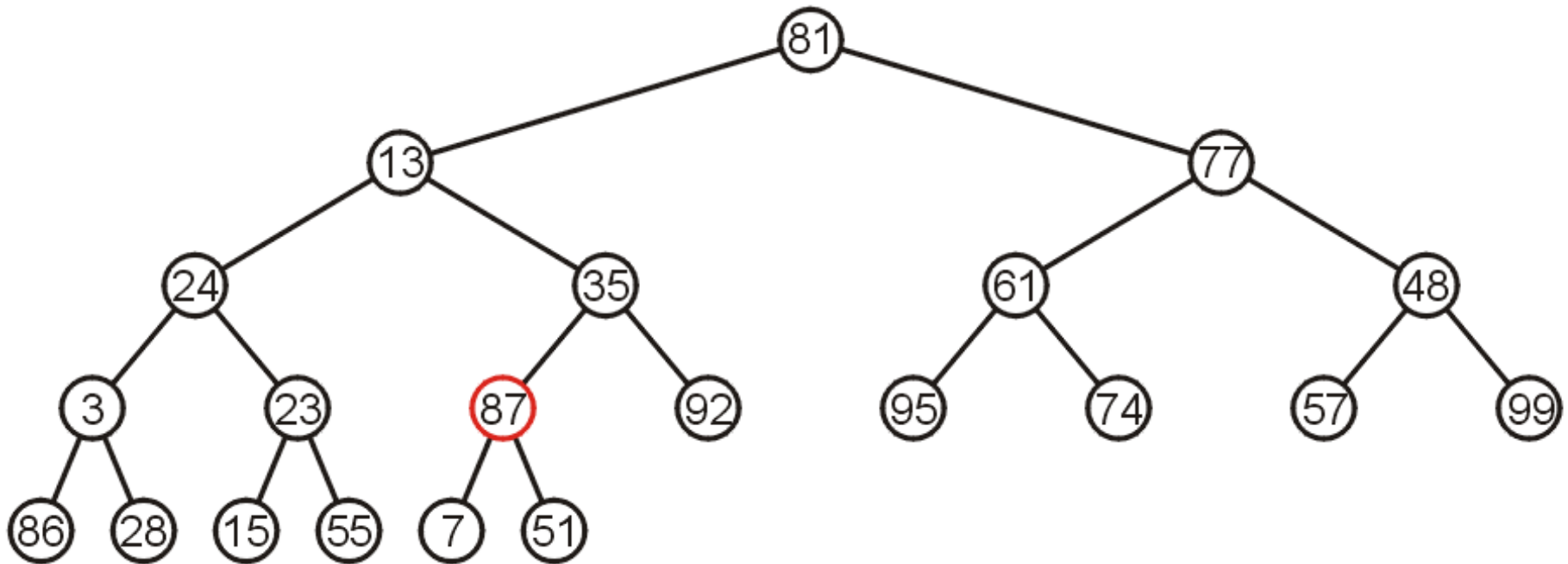


❑ It would be **exceptionally difficult** to start by determining what should be in the root.

■ We can work bottom-up instead: each **LEAF** node is a max-heap on its own.

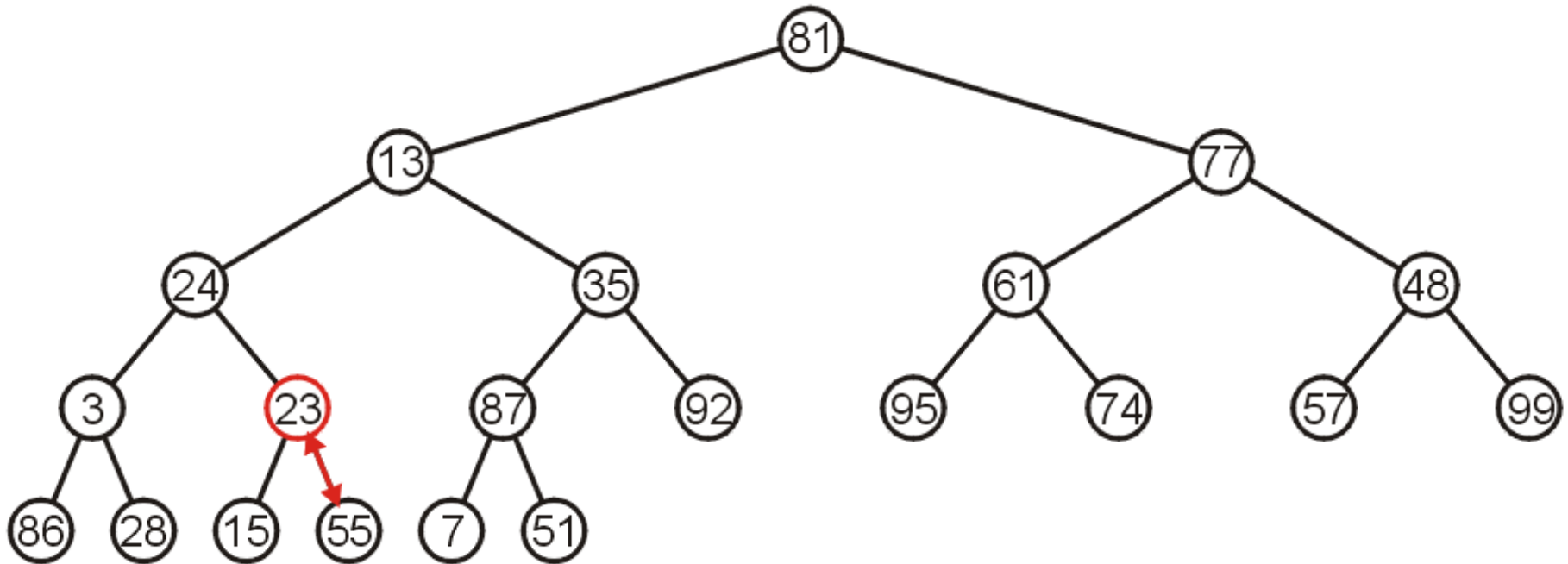
Building a heap (Bottom-up)

- Starting at the back, we note that all leaf nodes are trivial heaps.
- Also, the sub-tree with the node **87** as the root is a max-heap.



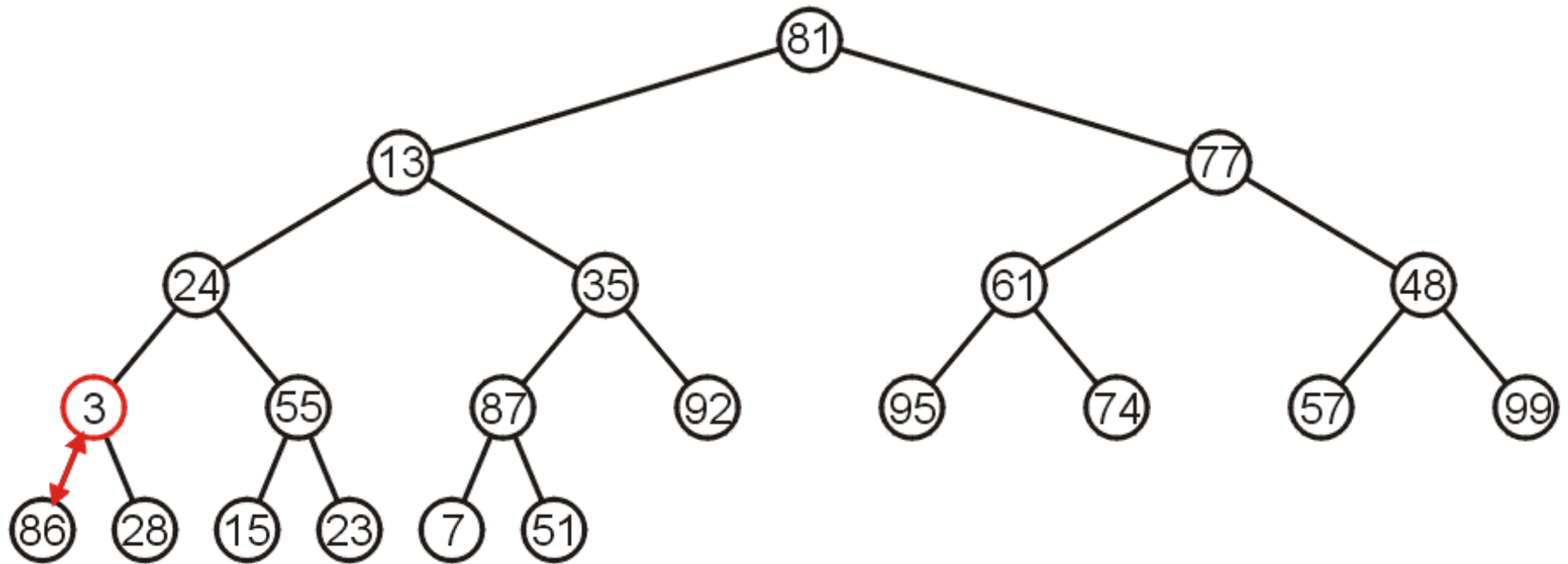
Building a heap (Bottom-up)

- The sub-tree with node **23** is not a max-heap, but swapping it with **55** creates a max-heap.
- This process is the aforementioned **sift down**.



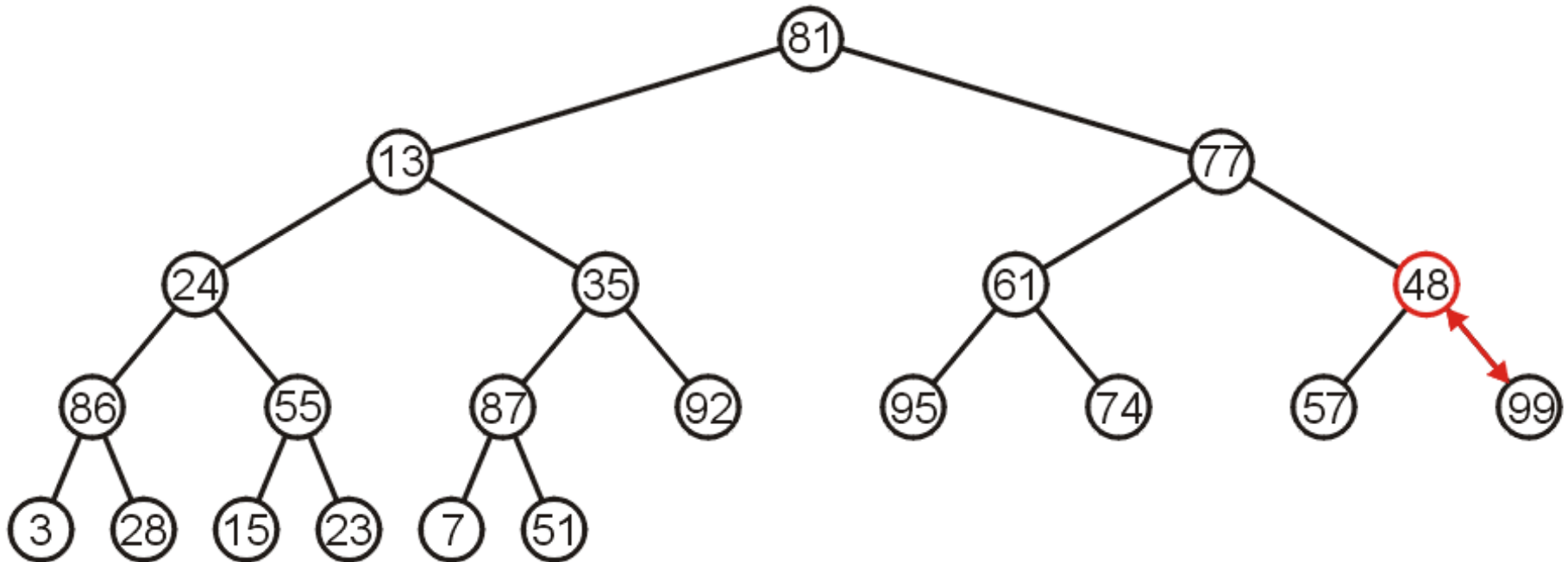
Building a heap (Bottom-up)

- The sub-tree with **3** as the root is not max-heap, but we can swap **3** and the maximum of its children: **86**.



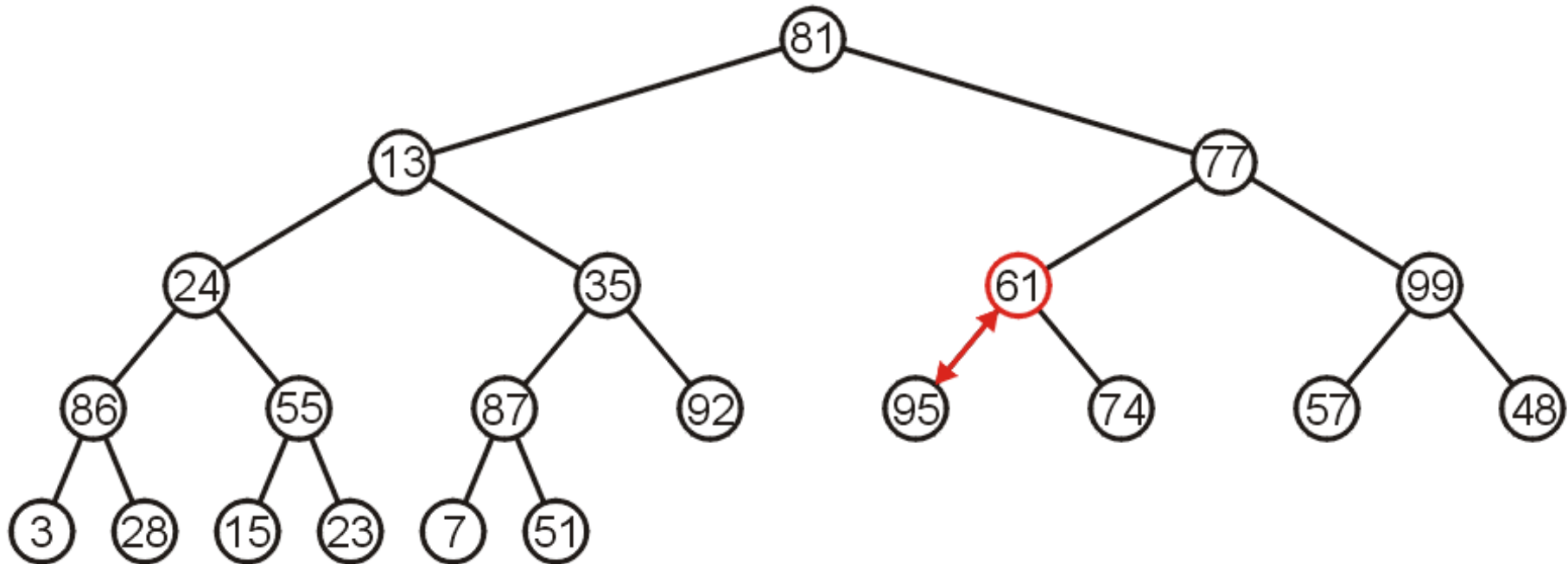
Building a heap (Bottom-up)

- Starting with the next higher level, the subtree with root **48** can be turned into a max-heap by swapping **48** and **99**.



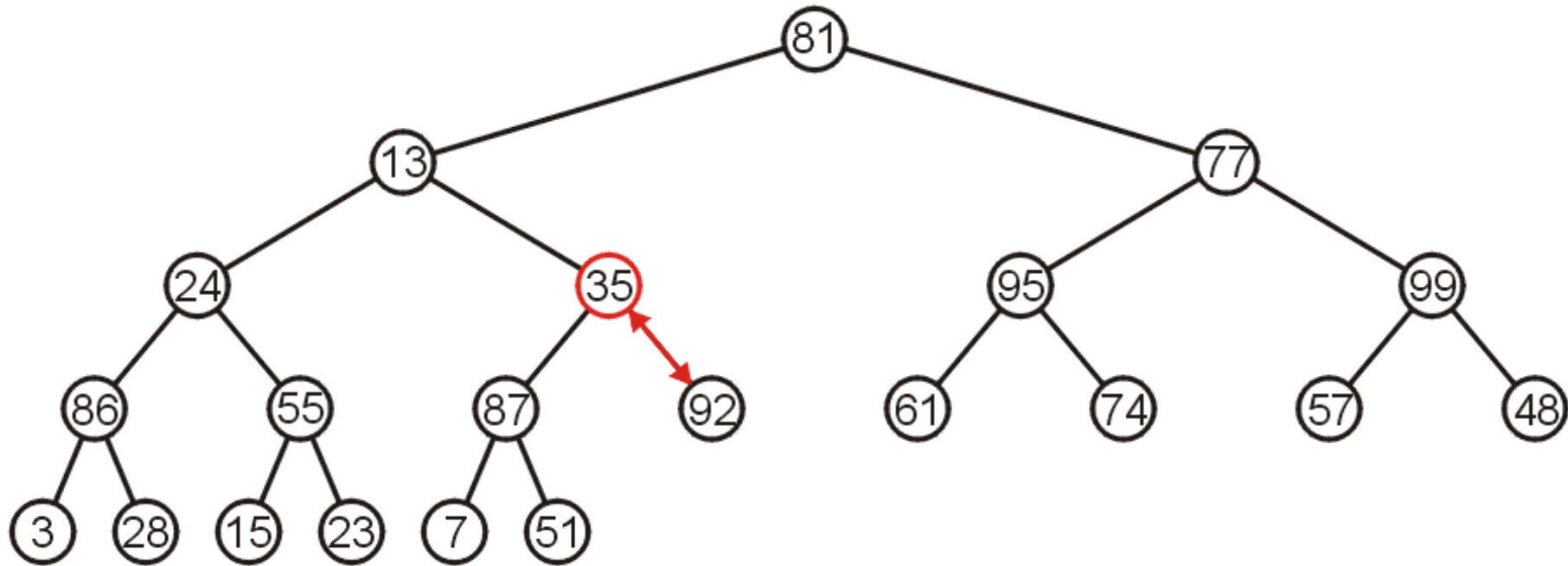
Building a heap (Bottom-up)

- Similarly, swapping **61** and **95** creates a max-heap of the next sub-tree.



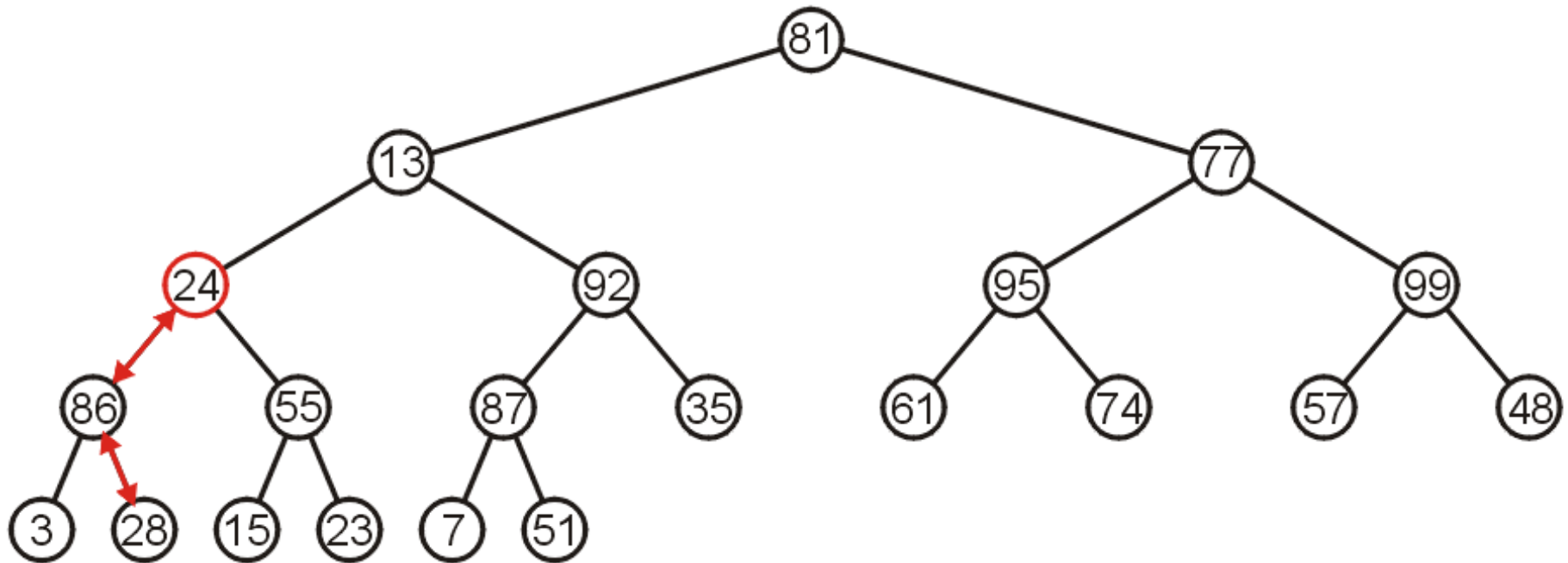
Building a heap (Bottom-up)

- As does swapping **35** and **92**.



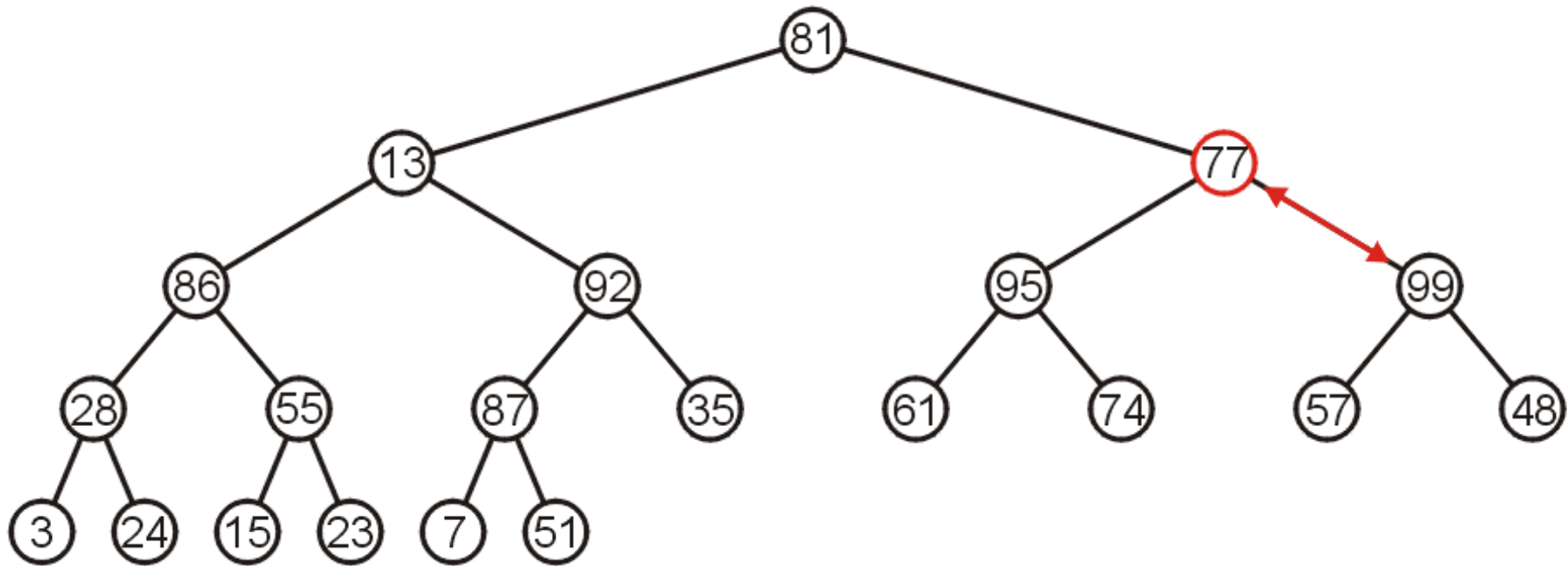
Building a heap (Bottom-up)

- The sub-tree with root **24** may be converted into a max-heap by first swapping **24** and **86** and then swapping **24** and **28**.



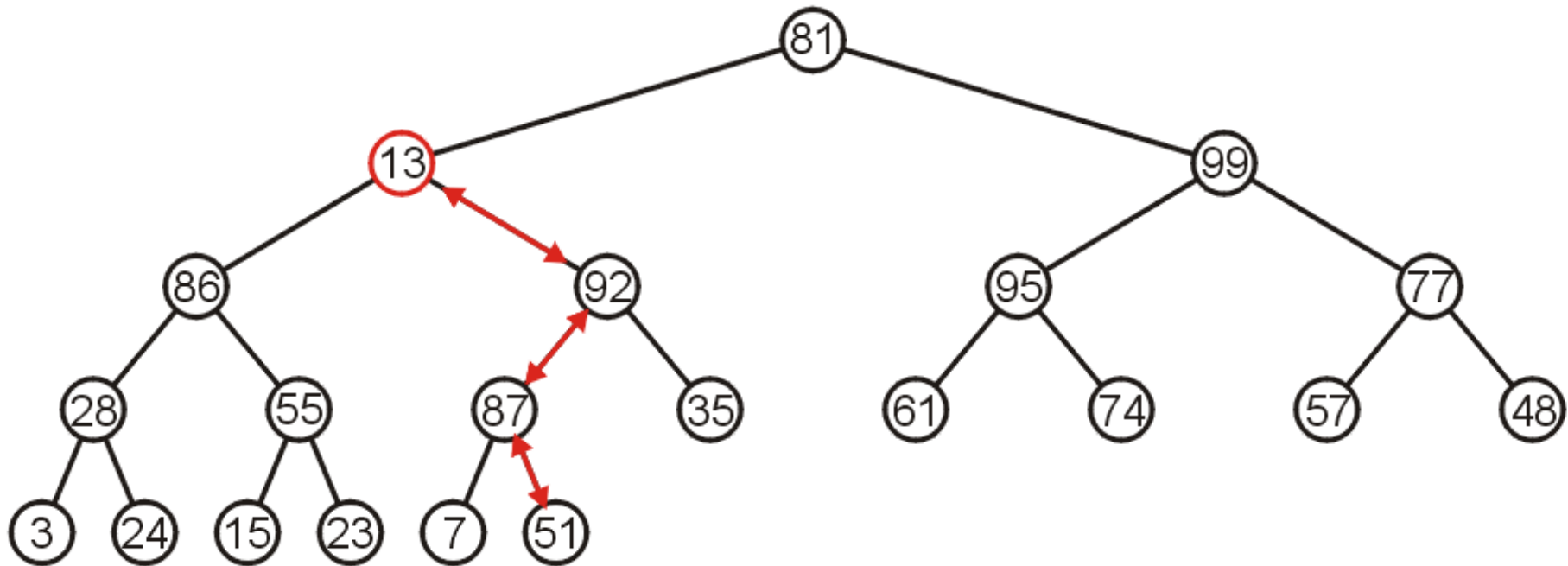
Building a heap (Bottom-up)

- The right-most sub-tree of the next higher level may be turned into a max-heap by swapping **77** and **99**.



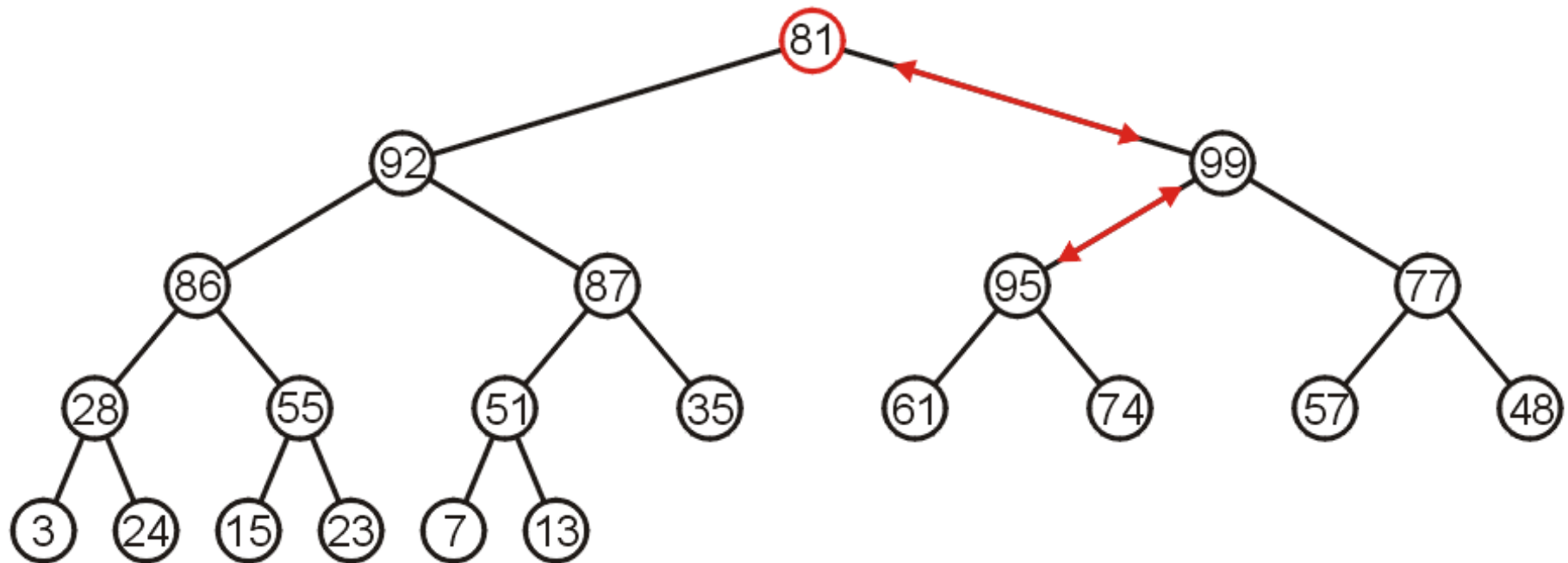
Building a heap (Bottom-up)

- However, to turn the next sub-tree into a max-heap requires that **13** be percolated down to a leaf node.



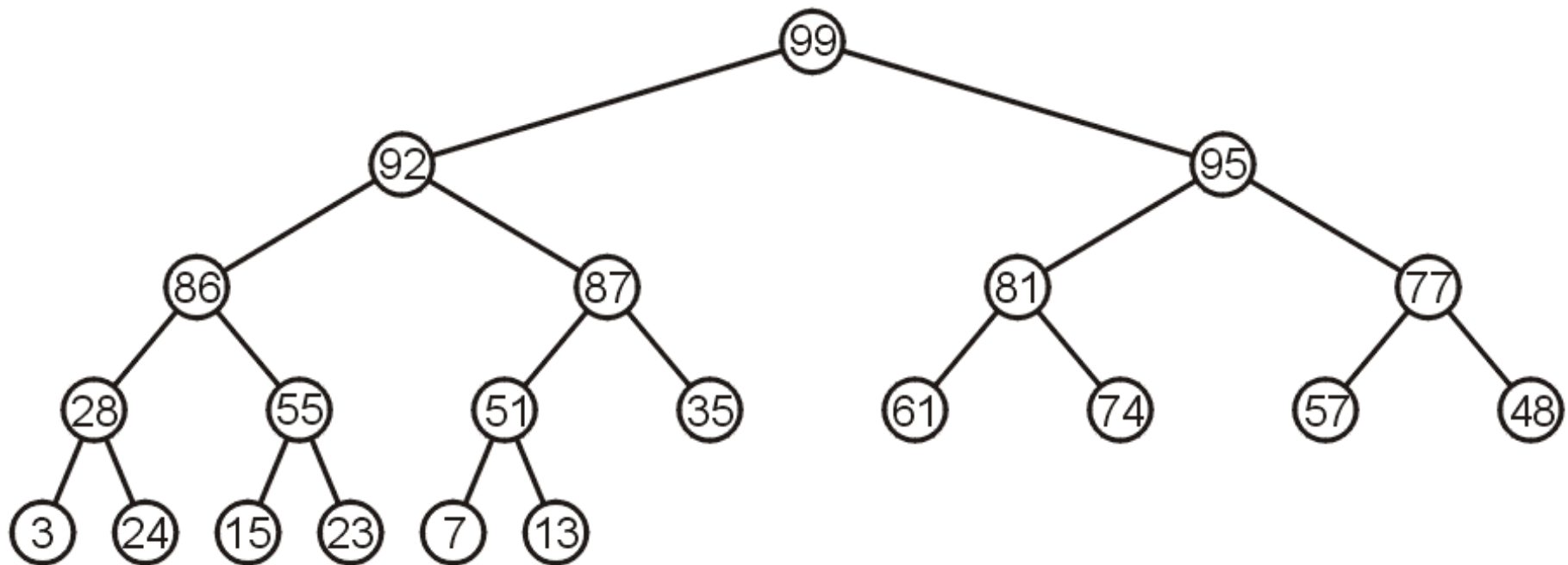
Building a heap (Bottom-up)

- The root need only be percolated down by two levels.



Building a heap (Bottom-up)

- The final product is a **max-heap**.



The General Idea of the Heap Construction

□ A bottom-up approach

- Starting from the last element of the given array

□ To ensure that the checked nodes all possess the max-heap property

- For each node, find the max node of the triple {current-node, left-child, right-child}
- Adjust the structure of the triple by **siftdown**
- Note that the percolating down could violate the max-heap-property of the **SUB-TREE** by the current node.
- It is the most important to maintain the max-heap property of the sub-tree, which is done by **recursion**.
- But note that to implement the percolating down, we only have to swap the current node with its **larger** child; thus, we only have to examine the max-heap-property of this sub-tree.

Building a heap (heapify)

```
void heapify( ) {  
    for(int p=last/2; p>0; p--) { //从最右边的第一个中间节点开始  
        siftdown(p);  
    }  
}
```

- **Cost(heapify)** = is the sum of all **cost(siftdown)**
- Each **siftdown** operation can cost at most the number of levels it takes for the node being sifted to reach the bottom of the tree.
- So, this algorithm takes **$O(n)$** time in the worst case (why?)

Run-time Analysis of heapify

- Considering a perfect tree of height h :
 - The maximum number of swaps which a second-lowest level would experience is 1; the next higher level, 2; and so on.



Run-time Analysis of heapify

- At depth k , there are 2^k nodes and in the worst case, all of these nodes would have to sift down $h - k$ levels
 - In the worst case, this would requiring a total of $2^k (h - k)$ swaps
 - the mathematical expression of this sum comes to:

$$\sum_{k=0}^h 2^k (h - k) = (2^{h+1} - 1) - (h + 1)$$

Run-time Analysis of heapify

- A complete binary tree takes $n = 2^{h+1} - 1$ nodes
- $h + 1 = \log(n + 1)$
- therefore

$$\sum_{k=0}^h 2^k (h - k) = n - \log(n + 1)$$

- Each swap requires two comparisons (which child is greatest), so there is a maximum of $2n$ (or $O(n)$) comparisons

Heap removal

- Removing the maximum (root) value from a heap containing n elements requires
 - maintain the complete binary tree shape,
 - by moving the element in the last position in the heap (the current last element in the array) to the root position.
 - the remaining $n-1$ node values conform to the heap property.
 - If the new root value is not the maximum value in the new heap, use **siftdown** to reorder the heap.
- the cost of deleting the maximum element is **$O(\log(n))$** in the average and worst cases, since the heap is $\log(n)$ levels deep.

Heap removal Implementation

- 取出堆顶元素（最大值或最小值）

```
E removefirst() { // pop()
    Assert( last > 0, "Heap is empty");

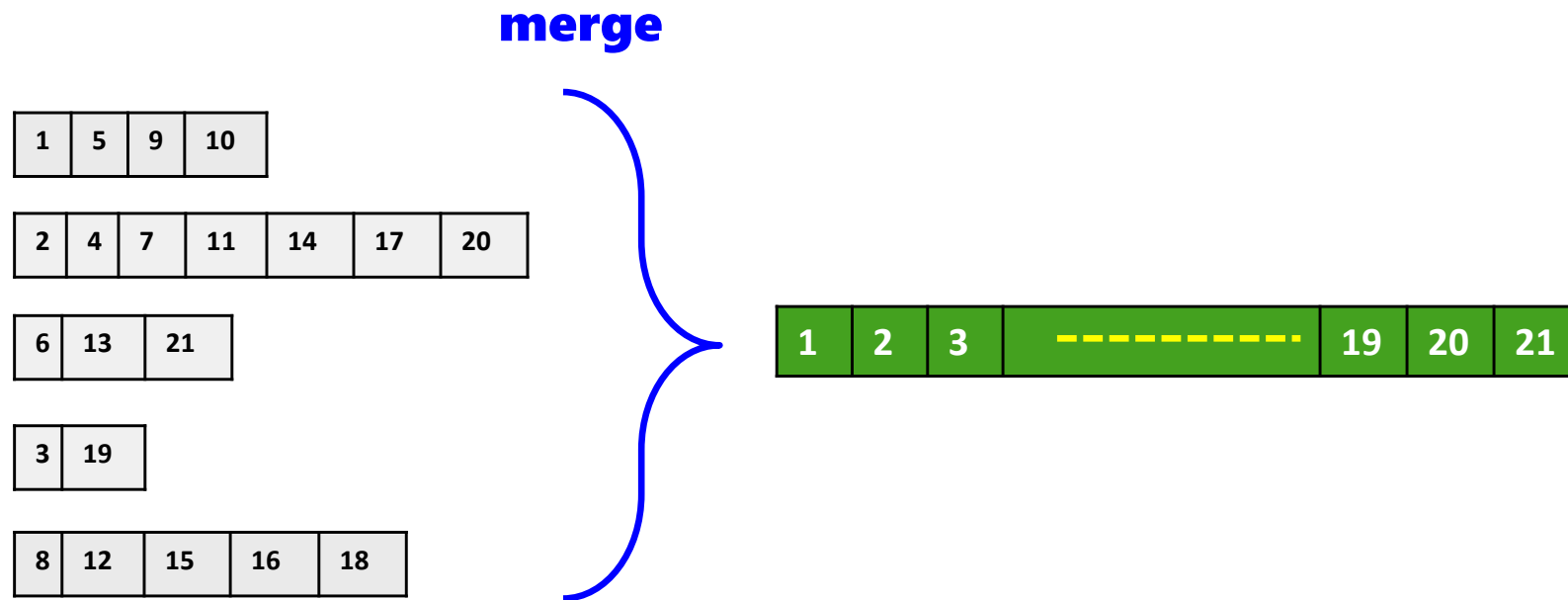
    E tmp = Heap[1]; //拷贝堆顶元素
    Heap[1] = Heap[last--];
                    //把最后一个元素移动堆顶
                    //堆长度减1
    siftdown(1);
                    //下沉堆顶，调整堆
    return tmp;
}
```




12.2 Heap Application

合并n个升序或降序序列

把n个升序（降序）序列： A_1, A_2, \dots, A_n ，合并成一个升序（降序）序列。



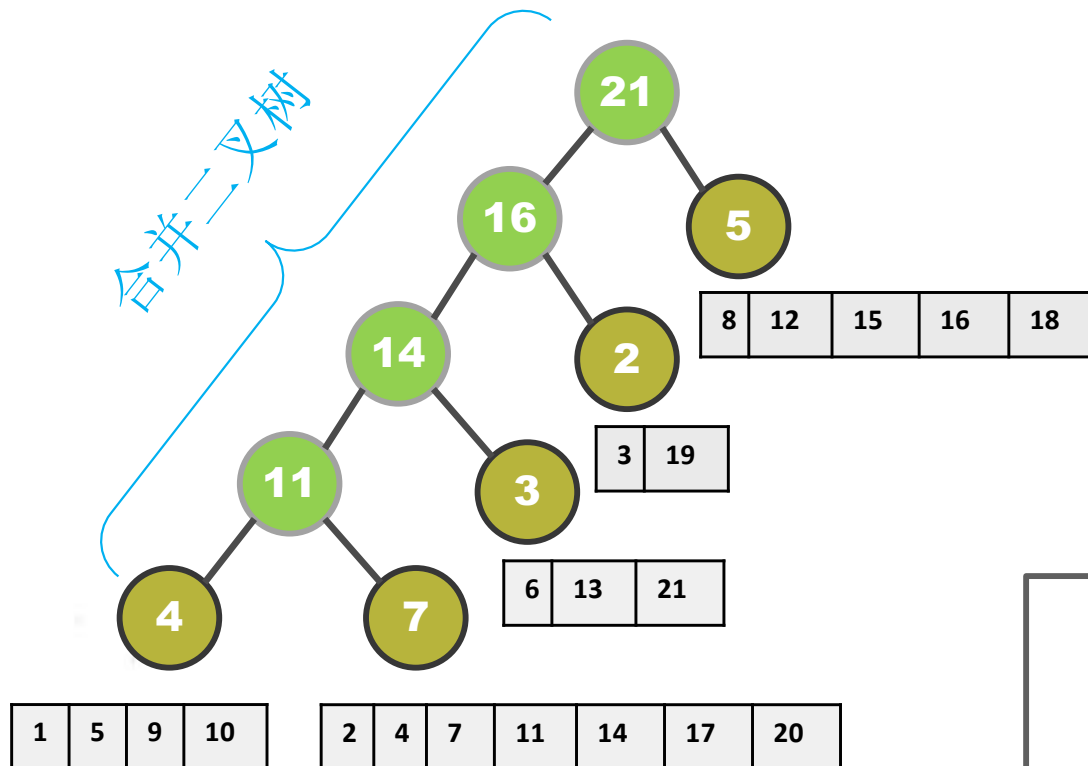
合并n个升序或降序序列

（方法1）顺序合并（两两合并）

- 比较总次数：62

- 可用N个叶节点的(Full)二叉树表达合并过程

- 中间节点的权重表示两个序列合并后的长度及合并时间（比较次数）
- 合并总时间等于中间节点的权重和

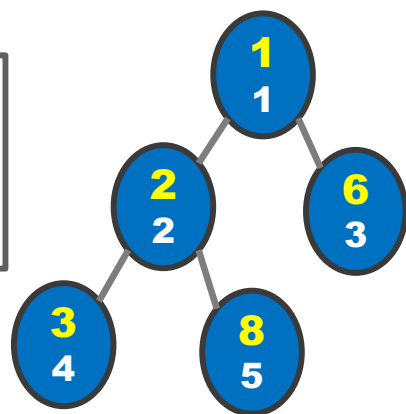


$$T\left(\sum_{1 \leq i \leq n} |A_i|\right) = \sum_{i=1}^n \text{Depth}(A_i) * |A_i|$$

合并n个升序或降序序列

(方法2) 同步合并 with heap!

设计存放所有
 $\langle A_x[i_x], x \rangle$ 的最小堆
($1 \leq x \leq n$)



MIN HEAP

i_1

1	5	9	10
---	---	---	----

i_2

2	4	7	11	14	17	20
---	---	---	----	----	----	----

i_3

6	13	21
---	----	----

i_4

3	19
---	----

i_5

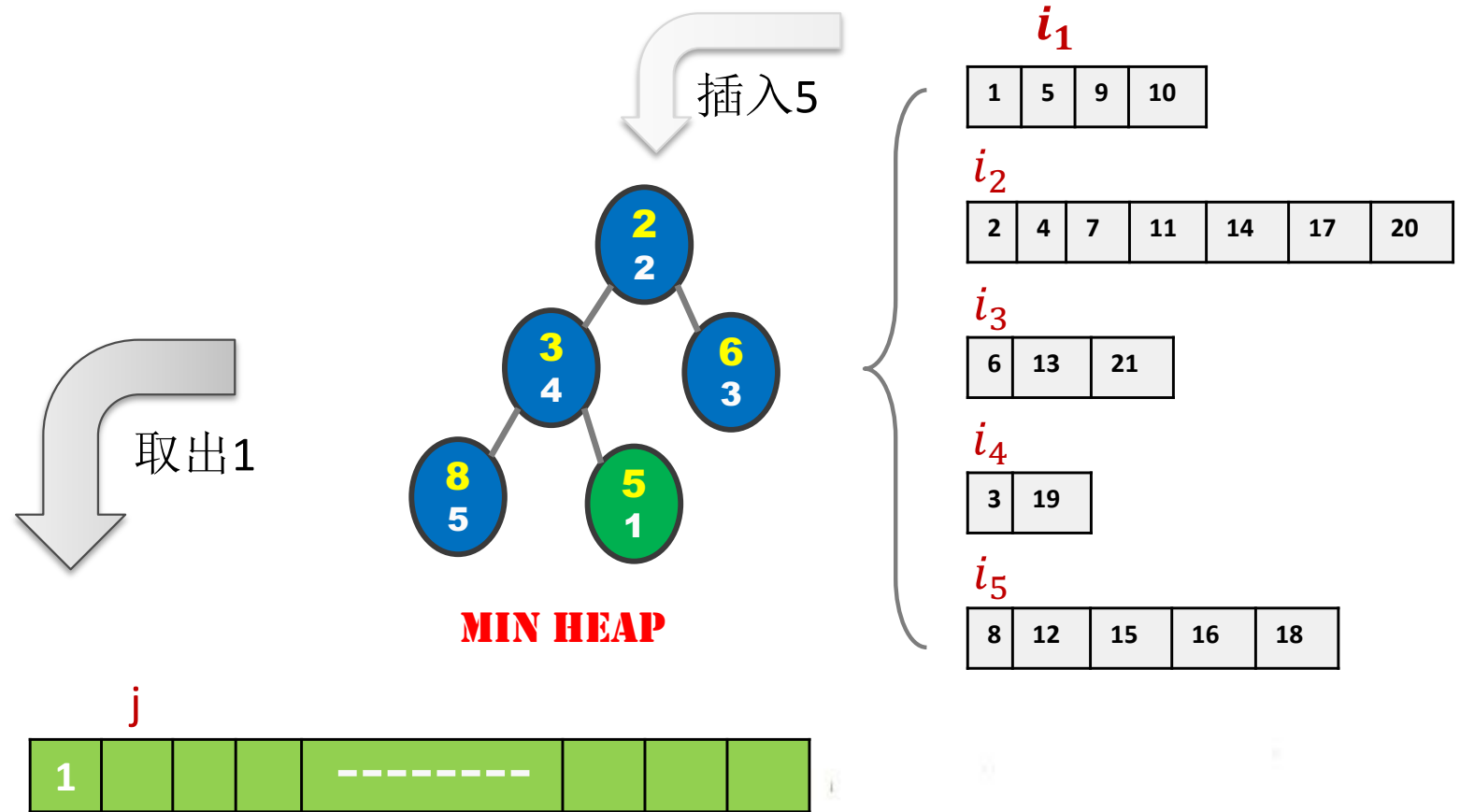
8	12	15	16	18
---	----	----	----	----

用指针 i_x 指向数组 A_x 中
最小值位置 ($1 \leq x \leq n$)

- ① 取出堆顶元素 $\langle A_y[i_y], y \rangle$ 并将 $A_y[i_y]$ 放入合并后的数组
- ② 如果 $i_y < |A_y|$, 插入 $\langle A_y[i_y + 1], y \rangle$ 至堆, 指针 $i_y = i_y + 1$
- ③ 重复上述处理, 直到合并完所有元素 (堆变空!)

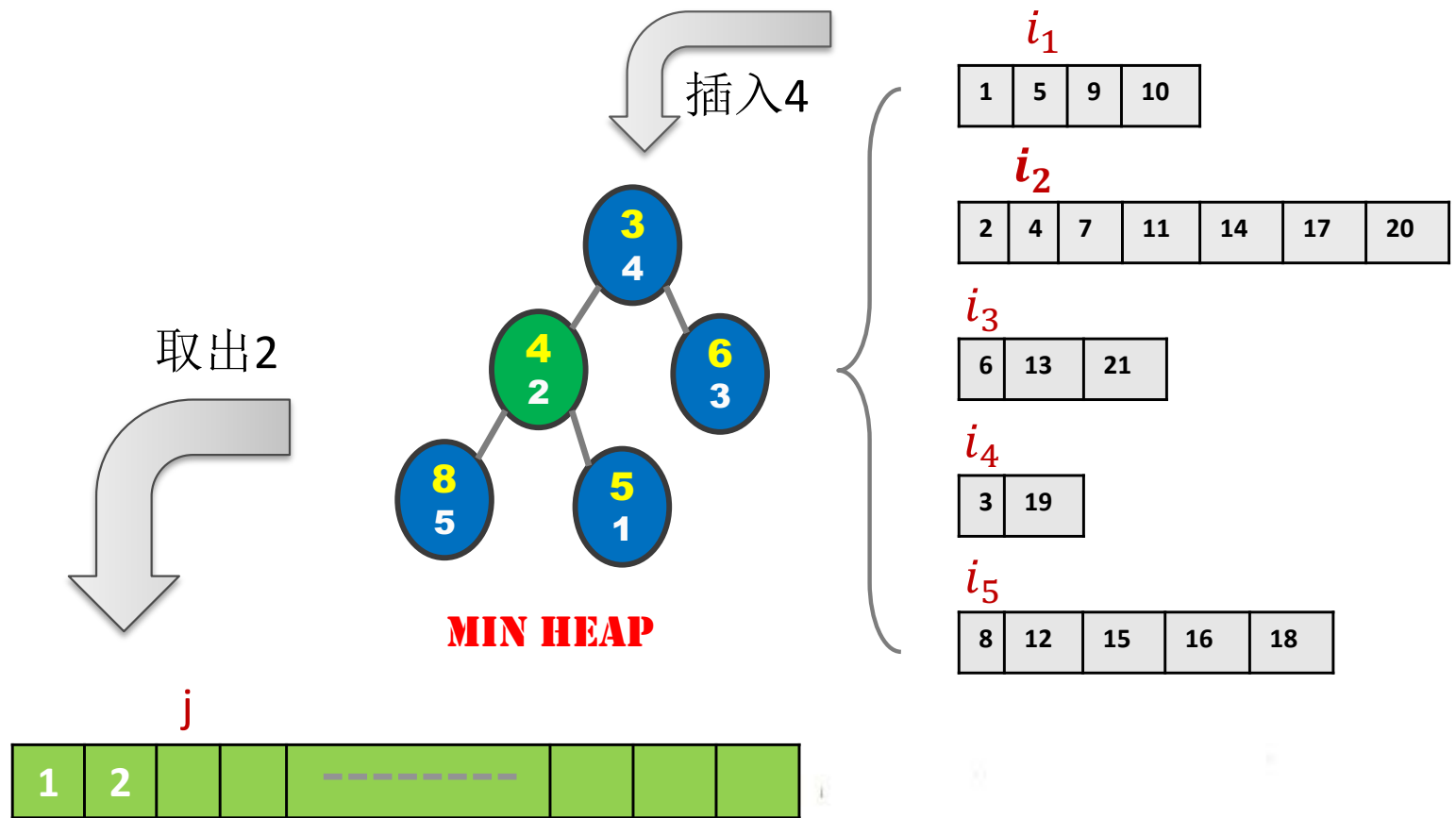
合并n个升序或降序序列

(方法2) 同步合并 with heap!



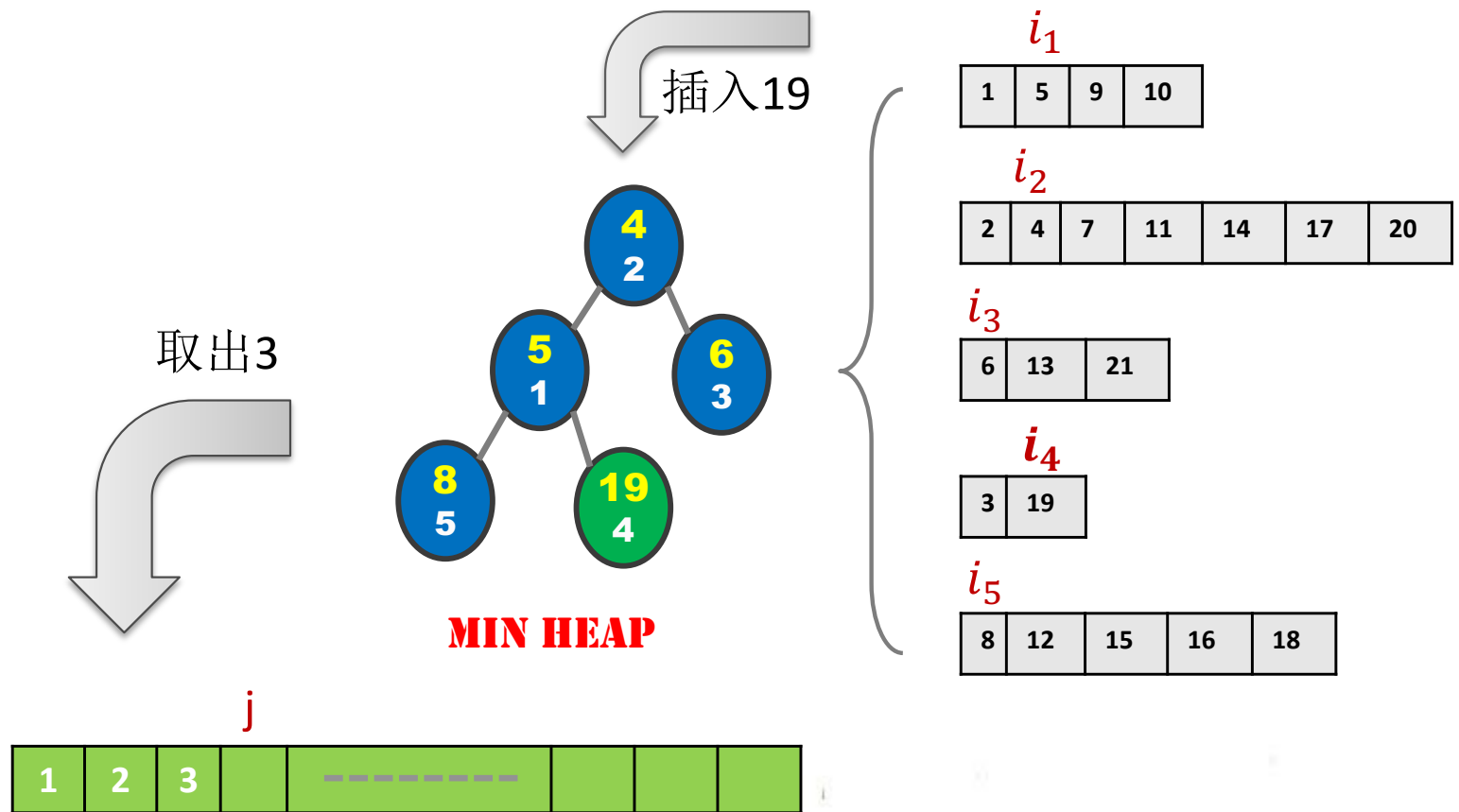
合并n个升序或降序序列

(方法2) 同步合并 with heap!



合并n个升序或降序序列

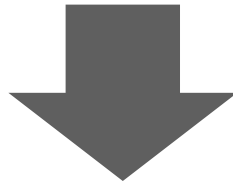
(方法2) 同步合并 with heap!



合并n个升序或降序序列

(方法2) 同步合并 with heap!

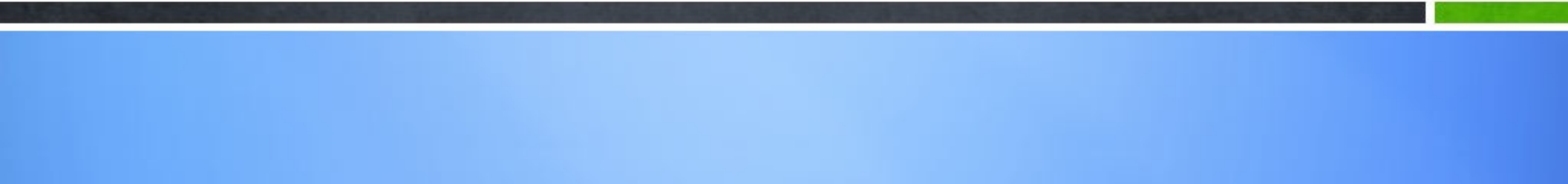
- 用指针 i_x 指向数组 A_x ($1 \leq x \leq n$)中最小值位置 ($i_x = 1$)
- 设计存放所有 $\langle A_x[i_x], x \rangle$ 的最小堆 ($1 \leq x \leq n$)
- 取出堆顶元素 $\langle A_y[i_y], y \rangle$ 并放入合并后的数组; 如果 $i_y < |A_y|$, 插入 $\langle A_y[i_y + 1], y \rangle$ 至堆, 指针 $i_y = i_y + 1$ 。重复该处理, 直到合并完所有元素



$$T\left(\sum_{1 \leq i \leq n} |A_i|\right) = \left(\sum_{i=1}^n |A_i|\right) * \log(n)$$



12.3 Heap Sort



Heapsort

```
template <typename E, typename Comp>
void heapsort(E A[], int n) { // Heapsort
    E maxval;
    heap<E, Comp> H(A, n, n);    // Build the heap
    for (int i=0; i<n; i++)      // Now sort
        maxval = H.removefirst(); // Place maxval at end
}
```

Cost of heapsort: $\Theta(n \log n)$

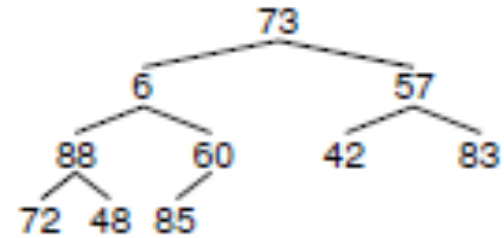
in the worst, average, and best cases.

1. building the heap takes $O(n)$ time
2. n deletions of the maximum element each take $(\log n)$ time

Heapsort: example

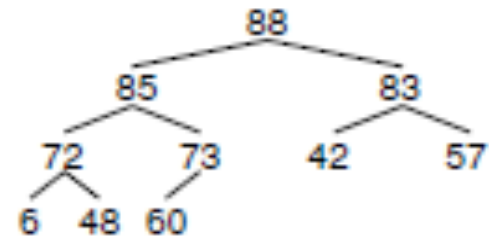
Original Numbers

73	6	57	88	60	42	83	72	48	85
----	---	----	----	----	----	----	----	----	----



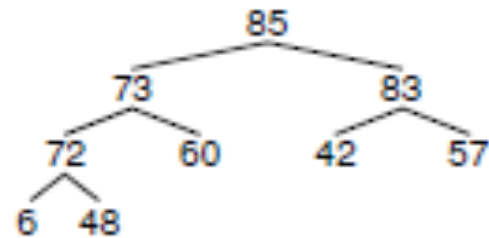
Build Heap

88	85	83	72	73	42	57	6	48	60
----	----	----	----	----	----	----	---	----	----



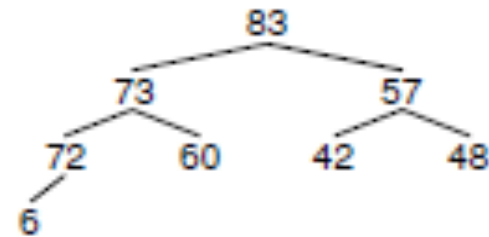
Remove 88

85	73	83	72	60	42	57	6	48	88
----	----	----	----	----	----	----	---	----	----



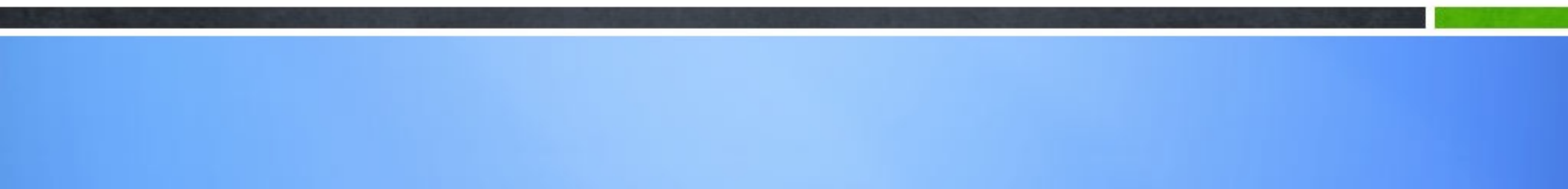
Remove 85

83	73	57	72	60	42	48	6	85	88
----	----	----	----	----	----	----	---	----	----





12.4 Comparison of Sorting Algorithms



Comparison of Running Time

Sorting Algorithms	Average	Best	Worst
Insertion sort	$\Theta(n^2)$	$\Theta(n)$	$\Theta(n^2)$
Shellsort	$O(n^{1.5})$	$\Theta(n \log n)$	$\Theta(n^2)$
Bubblesort	$\Theta(n^2)$	$\Theta(n^2)$ or $\Theta(n)$	$\Theta(n^2)$
Quicksort	$\Theta(n \log n)$	$\Theta(n \log n)$	$\Theta(n^2)$
Selection sort	$\Theta(n^2)$	$\Theta(n^2)$	$\Theta(n^2)$
Heapsort	$\Theta(n \log n)$	$\Theta(n \log n)$	$\Theta(n \log n)$
Mergesort	$\Theta(n \log n)$	$\Theta(n \log n)$	$\Theta(n \log n)$
Radixsort	$\Theta(n)$	$\Theta(n)$	$\Theta(n)$

Comparison of Space

Sorting Algorithms	Auxiliary space
Insertionsort	$O(1)$
Shellsort	$O(1)$
Bubblesort	$O(1)$
Quicksort	$O(\log n) \sim O(n)$
Selectionsort	$O(1)$
Heapsort	$O(1)$
Mergesort	$O(n)$
Radixsort	$O(n)$


Comparison of Stability

(1) Stable Algorithms


- Insertion sort
- Bubble sort
- Selection sort
- Merge sort
- Radix sort

(2) Unstable Algorithms:

- Shell sort
- Quick sort
- Heap sort



数据结构与算法课程组
重庆大学计算机学院



End of Section.

