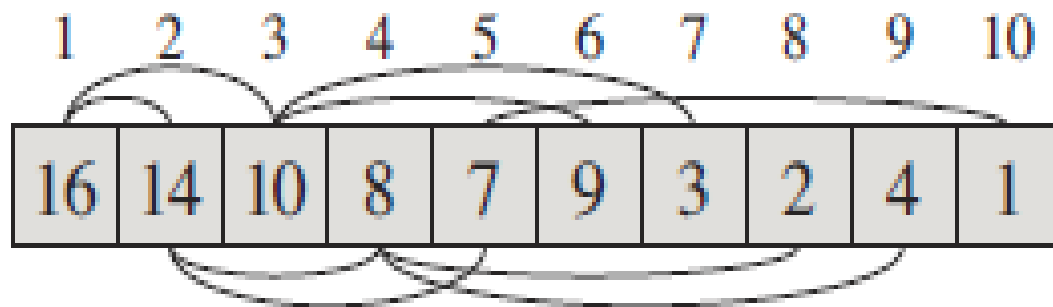
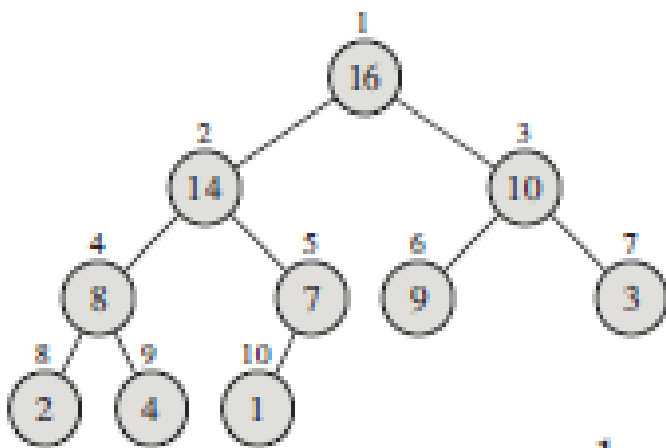


# 计算机问题求解 — 论题2-12

## - 堆与堆排序

2016年05月05日



问题1:

为什么有时可以将数组理解为二叉树?

为什么数组会有一个A.heap-size?

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问题2:

堆与我们上次讨论的队列与栈最突出的差别是什么？

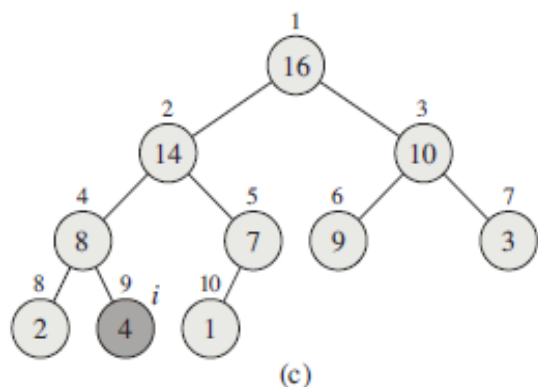
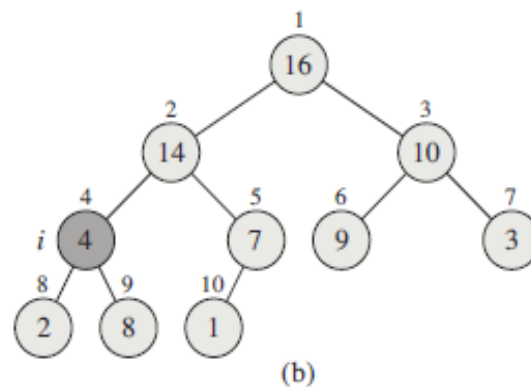
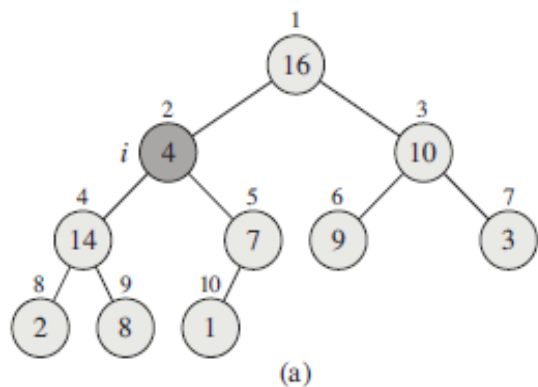
其特征与对象的内容相关，  
一定是源于具体应用。

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# 堆（偏序树）性质

- 树  $T$  满足偏序树性质 当且仅当 树中任一结点的键值不小于（或不大于）其子结点（如果有）的键值。
- 此性质在数组实现中的表示：
  - Max-heap:  $A[\text{PARENT}(i)] \geq A[i]$
  - Min-heap:  $A[\text{PARENT}(i)] \leq A[i]$

如果我们要定义堆的  
**ADT**，在其数据部分，  
我们应该给出什么约束？



问题3:  
Max-Heapify的  
precondition  
是什么?

特别解释一下

*largest*

MAX-HEAPIFY( $A, i$ )

```

1   $l = \text{LEFT}(i)$ 
2   $r = \text{RIGHT}(i)$ 
3  if  $l \leq A.\text{heap-size}$  and  $A[l] > A[i]$ 
4       $\text{largest} = l$ 
5  else  $\text{largest} = i$ 
6  if  $r \leq A.\text{heap-size}$  and  $A[r] > A[\text{largest}]$ 
7       $\text{largest} = r$ 
8  if  $\text{largest} \neq i$ 
9      exchange  $A[i]$  with  $A[\text{largest}]$ 
10     MAX-HEAPIFY( $A, \text{largest}$ )

```

问题4:

你能利用上图解释Max-Heapify吗?

# Worst-case Analysis for Max-Heapify

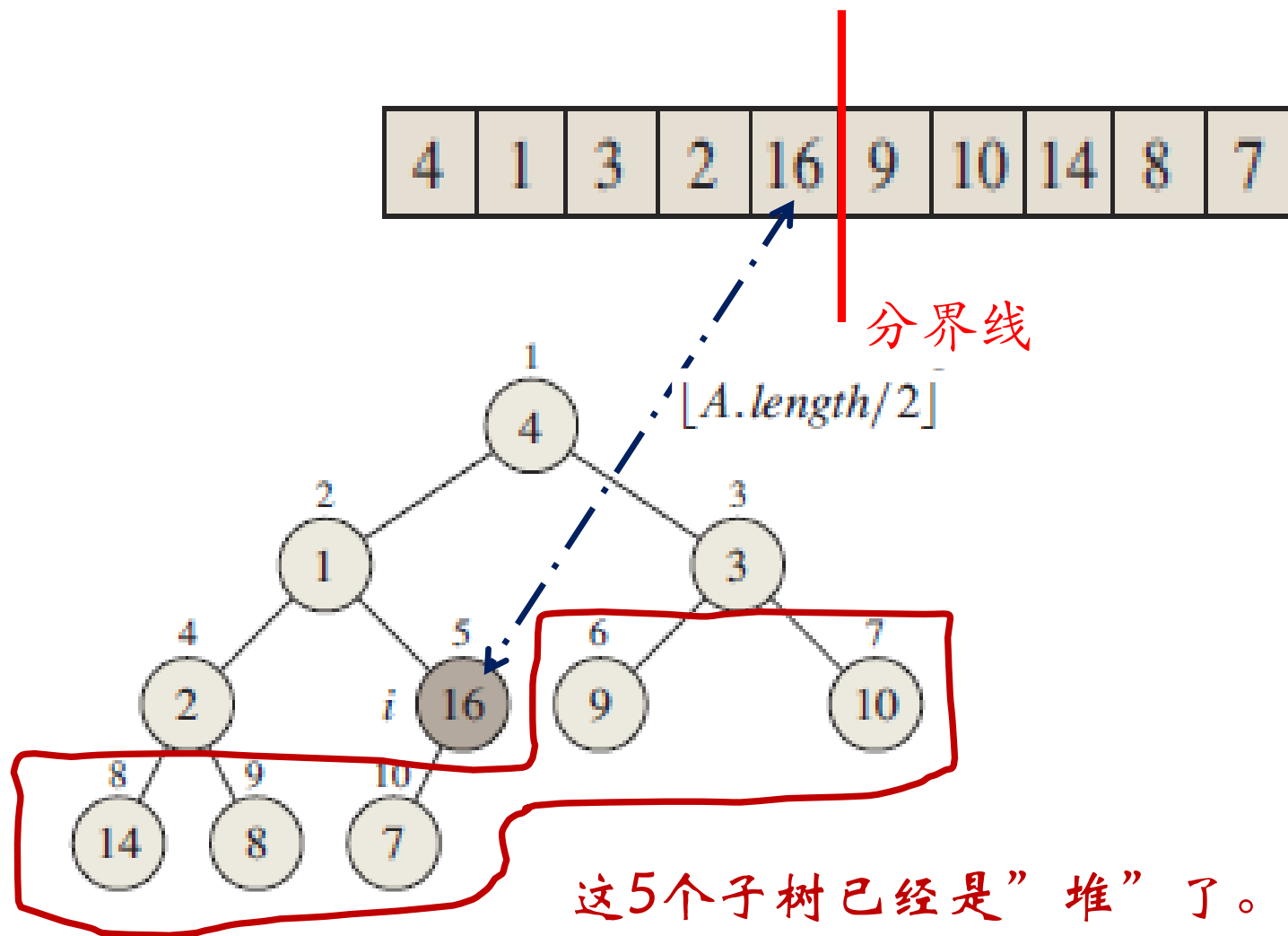
- 过程Max-Heapify中不包含循环，所以，如果不递归，其代价是 $O(1)$ 。
  - 如果考虑比较运算的次数，每“下沉”一层，执行2次比较。

- 递归:  $T(n) \leq T(2n/3) + \Theta(1)$

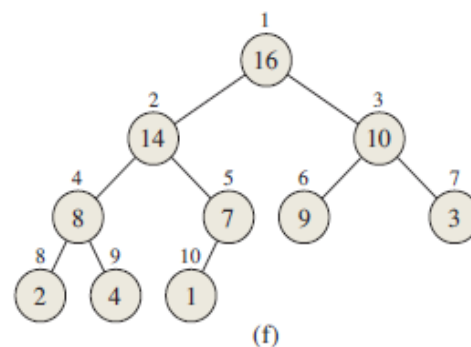
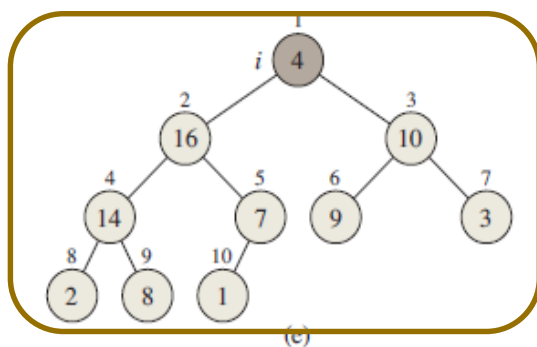
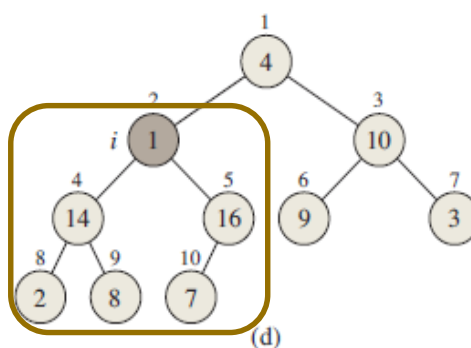
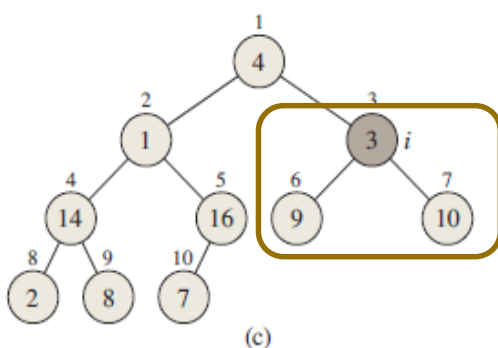
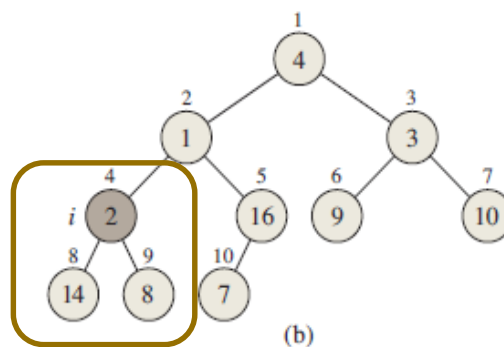
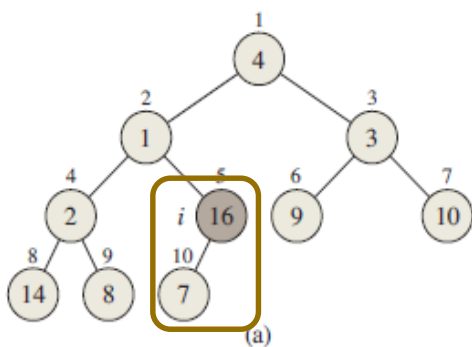
问题5:  
为什么?

The solution to this recurrence, by case 2 of the master theorem (Theorem 4.1), is  $T(n) = O(\lg n)$ . Alternatively, we can characterize the running time of MAX-HEAPIFY on a node of height  $h$  as  $O(h)$ .

# 造“堆”：自底向上



A [ 4 | 1 | 3 | 2 | 16 | 9 | 10 | 14 | 8 | 7 ]



问题6:  
这个循环的  
invariant  
是什么?

BUILD-MAX-HEAP(*A*)

- 1  $A.heap-size = A.length$
- 2 for  $i = \lfloor A.length/2 \rfloor$  downto 1
- 3     MAX-HEAPIFY(*A*, *i*)



# Built-Max-Heap正确性证明

At the start of each iteration of the for loop of lines 2–3, each node  $i + 1, i + 2, \dots, n$  is the root of a max-heap.

**Initialization:** Prior to the first iteration of the loop,  $i = \lfloor n/2 \rfloor$ . Each node  $\lfloor n/2 \rfloor + 1, \lfloor n/2 \rfloor + 2, \dots, n$  is a leaf and is thus the root of a trivial max-heap.

**Maintenance:** To see that each iteration maintains the loop invariant, observe that the children of node  $i$  are numbered higher than  $i$ . By the loop invariant, therefore, they are both roots of max-heaps. This is precisely the condition required for the call  $\text{MAX-HEAPIFY}(A, i)$  to make node  $i$  a root of a max-heap. the MAX-HEAPIFY call preserves the property that  $i + 1, i + 2, \dots, n$  are all roots of max-heaps. Decrementing  $i$  in the loop maintains the loop invariant for the next iteration.

**Termination:** At termination,  $i = 0$ . By the loop invariant,  $i + 1, i + 2, \dots, n$  is the root of a max-heap. In particular, node 1 is.

为什么算法是  
**downto 1**，而不是  
**upto length/2**?

# A Poor Upper Bound

We can compute a simple upper bound on the running time of BUILD-MAX-HEAP as follows. Each call to MAX-HEAPIFY costs  $O(\lg n)$  time, and BUILD-MAX-HEAP makes  $O(n)$  such calls. Thus, the running time is  $O(n \lg n)$ . This upper bound, though correct, is not asymptotically tight.

问题7:

为什么这个Bound不很好?

# 关于堆的两点数学知识

假设二叉树的高度是 $h$ , 结点数是 $n$ , 则:

$$h = \lfloor \lg n \rfloor$$

$n$  个元素的堆所包含的  
高度为 $h$ 的结点个数最多是:

$$\left\lceil \frac{n}{2^{h+1}} \right\rceil$$

# 建堆的时间复杂度是线性的

$$\sum_{h=0}^{\lfloor \lg n \rfloor} \left\lceil \frac{n}{2^{h+1}} \right\rceil O(h) = O\left(n \sum_{h=0}^{\lfloor \lg n \rfloor} \frac{h}{2^h}\right)$$

其中:  $\sum_{h=0}^{\lfloor \lg n \rfloor} \frac{h}{2^h} \in O\left(\sum_{h=0}^{\infty} \frac{h}{2^h}\right)$ , 而  $\sum_{h=0}^{\infty} \frac{h}{2^h} = \sum_{h=0}^{\infty} h \left(\frac{1}{2}\right)^h$

即:  $\sum_{h=0}^{\infty} hx^h, (x = \frac{1}{2})$ , 而  $\sum_{h=0}^{\infty} hx^h = \frac{x}{(1-x)^2}$

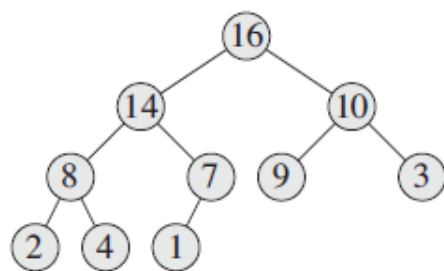
$\therefore$

$$O\left(n \sum_{h=0}^{\lfloor \lg n \rfloor} \frac{h}{2^h}\right) = O\left(n \sum_{h=0}^{\infty} \frac{h}{2^h}\right) = O(2n) = O(n)$$

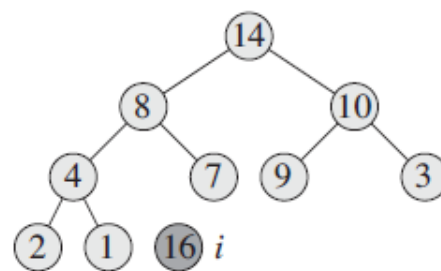
# 堆排序

HEAPSORT( $A$ )

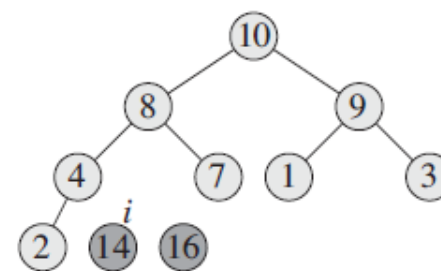
```
1  BUILD-MAX-HEAP( $A$ )
2  for  $i = A.length$  downto 2
3      exchange  $A[1]$  with  $A[i]$ 
4       $A.heap-size = A.heap-size - 1$ 
5      MAX-HEAPIFY( $A, 1$ )
```



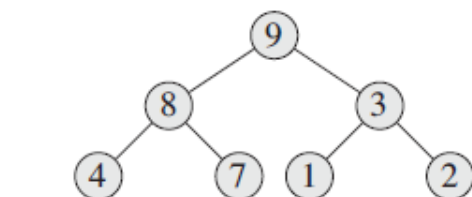
(a)



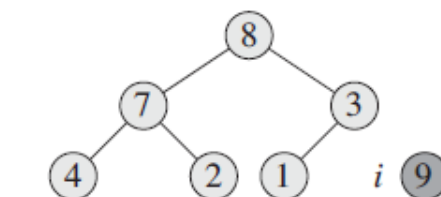
(b)



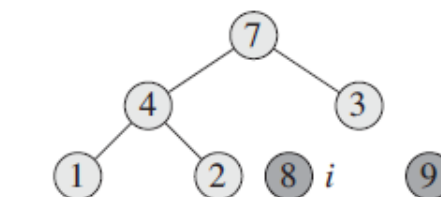
(c)



(d)



(e)



(f)

# 堆排序算法:

问题9:

怎么体现in-place, 即“原地输出”?

问题10:

你能解释为什么复杂度是 $O(n \lg n)$ ,  
这是worst-case, 还是average?

## 问题11:

你能否通过比较**priority-queue**与一般的**queue**,  
说明抽象数据类型对于计算机问题求解的意义?

# Max-Priority Queue

INSERT( $S, x$ ) inserts the element  $x$  into the set  $S$ , which is equivalent to the operation  $S = S \cup \{x\}$ .

MAXIMUM( $S$ ) returns the element of  $S$  with the largest key.

EXTRACT-MAX( $S$ ) removes and returns the element of  $S$  with the largest key.

INCREASE-KEY( $S, x, k$ ) increases the value of element  $x$ 's key to the new value  $k$ , which is assumed to be at least as large as  $x$ 's current key value.

抽象数据类型是为了减轻人思考的负担，而不是为了减轻计算机执行的负担。关键是如何实现！



# 实现: Array $\rightarrow$ Heap $\rightarrow$ Priority Queue

HEAP-MAXIMUM( $A$ )

1 return  $A[1]$

HEAP-INCREASE-KEY( $A, i, key$ )

```
1 if  $key < A[i]$ 
2   error "new key is smaller than current key"
3  $A[i] = key$ 
4 while  $i > 1$  and  $A[PARENT(i)] < A[i]$ 
5   exchange  $A[i]$  with  $A[PARENT(i)]$ 
6    $i = PARENT(i)$ 
```

HEAP-EXTRACT-MAX( $A$ )

```
1 if  $A.heap-size < 1$ 
2   error "heap underflow"
3  $max = A[1]$ 
4  $A[1] = A[A.heap-size]$ 
5  $A.heap-size = A.heap-size - 1$ 
6 MAX-HEAPIFY( $A, 1$ )
7 return  $max$ 
```

MAX-HEAP-INSERT( $A, key$ )

```
1  $A.heap-size = A.heap-size + 1$ 
2  $A[A.heap-size] = -\infty$ 
3 HEAP-INCREASE-KEY( $A, A.heap-size, key$ )
```

# Open Topics:

- 1, 写出堆的**ADT**及其形式规约
- 2, 用二叉树→堆→优先队列的方式给出优先队列的实现
- 3, 堆排序是**stable**的吗? 证明或举例

# 家庭作业

- TC pp.153-: ex.6.1-2, 6.1-4, 6.1-7
- TC pp.156-: ex.6.2-2, 6.2-5, 6.2-6
- TC pp.159-: ex.6.3-3
- TC pp.160-: ex.6.4-2, 6.4-4
- TC pp.164-: ex.6.5-5, 6.5-7, 6.5-9