

6. Heapsort

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1. Heap 錐型(樹)結構
 2. Heap property 錐型樹特性
 3. Heap construction 錐型樹之創建
 4. Heapsort 錐型排序
 5. Priority queue 優先佇列



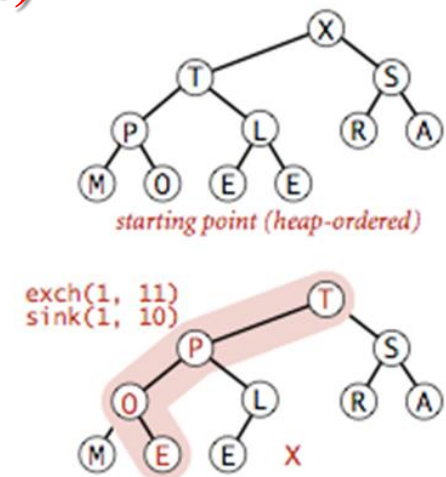
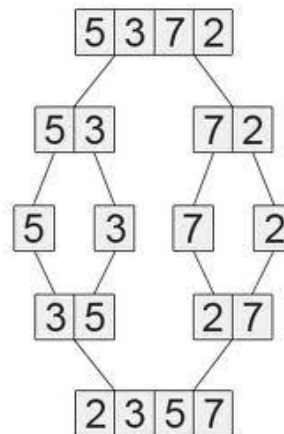
$$H \rightarrow \left. \right\} h_{\text{Heap}} \ll H$$

Why sorting 排序法的重要性

1. Sometimes the need to sort information is **inherent in a application**. 應用中不可或缺(固有)
2. Algorithms often use sorting as a **key subroutine**.
演算法中關鍵副程式
3. There is a **wide variety** of sorting algorithms, and they use rich set of techniques.
多種排序法可選擇, 應用到許多核心技術
4. Sorting problem has a **nontrivial lower bound**
下界未知(理論仍有突破空間)
5. **Many engineering issues** come to fore when implementing sorting algorithms.
實務應用時凸顯許多實作上的困難

Sorting algorithm

- **Insertion sort** : 無需(或只需常數)額外空間 $O(n^2)$
 - ✓ **In place**: only a constant number of elements of the input array are even sorted outside the array.
- **Merge sort** : 較快但需額外空間儲存中間值 $O(n \lg n)$
 - ✓ ***not*** in place.
- **Heap sort** : (Chapter 6) 無需額外空間且能在 $O(n \lg n)$ 完成
 - ✓ Sorts n numbers **in place** in $O(n \lg n)$

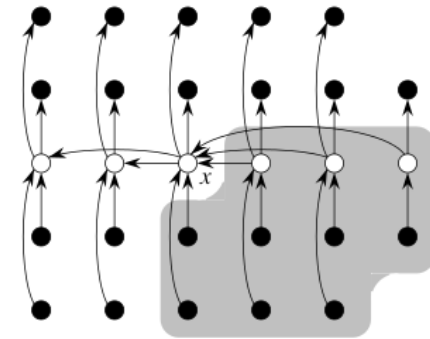


Sorting algorithm

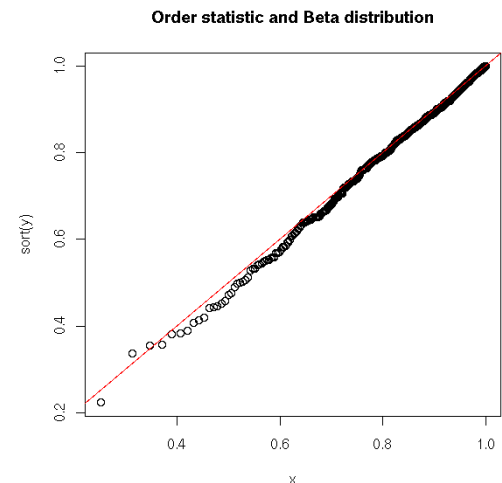
- **Quick sort** : (chapter 7) 快速排序
 - ✓ worst time complexity $O(n^2)$
 - ✓ Average time complexity $O(n \lg n)$
- **Decision tree model** : (chapter 8) 決策樹模型
 - ✓ Lower bound $O(n \lg n)$
 - ✓ Counting sort
 - ✓ Radix sort
- **Order statistics** (chapter 8, 9)

有序統計

把qsort w.c. 降至 $O(n \lg n)$

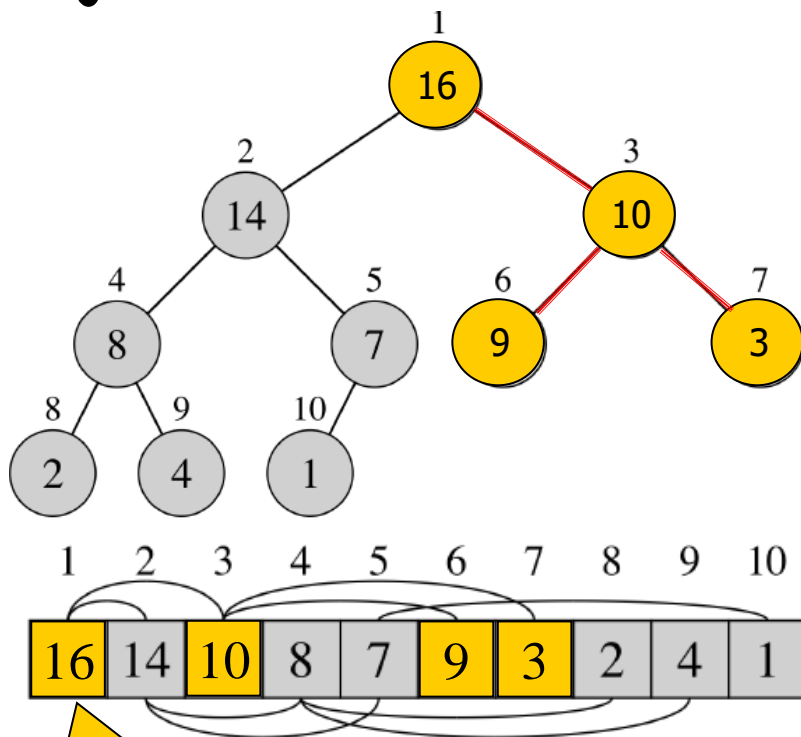


特殊狀況可打破模型限制 (降至 $O(n)$)



6.1 Heaps (Binary heap) 二元錐型結構

- The **binary heap** data structure is an **array** object that can be viewed as a **complete tree**.



幾乎是完全樹

第*i*個節點的父親在*i*/2位置

PARENT(*i*)

return $\lfloor i / 2 \rfloor$

LEFT(*i*) \swarrow *i*的左邊小孩在2*i*位置

return 2*i*

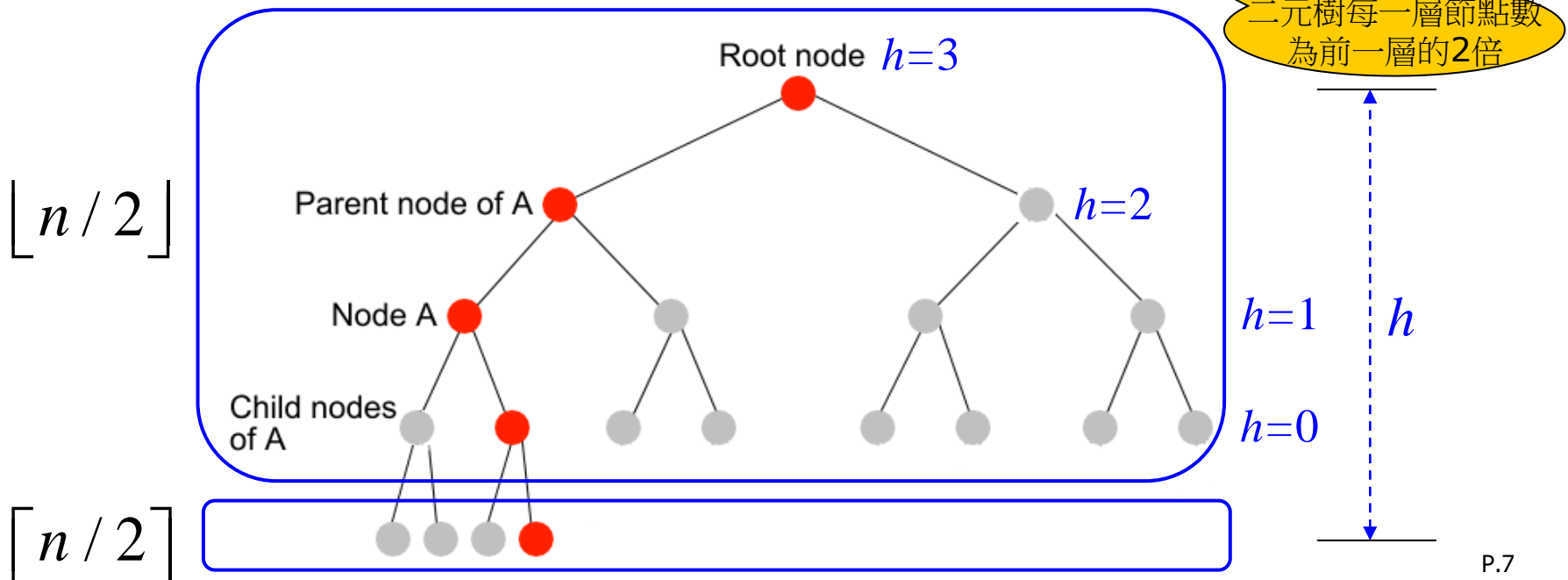
RIGHT(*i*) \swarrow *i*的右邊小孩在2*i*+1

return 2*i*+1

陣列的第1個元素為樹的根

完全二元樹的特性

1. 任何不在從最後一個leaf到root的唯一簡單路徑之節點(node)，為完全二元樹之根。
2. 一個高度為 h 之完全二元樹有 2^h 個leaves.
3. 若一顆樹有 n 個節點，則最多有 $\lceil n/2 \rceil$ 個leaves

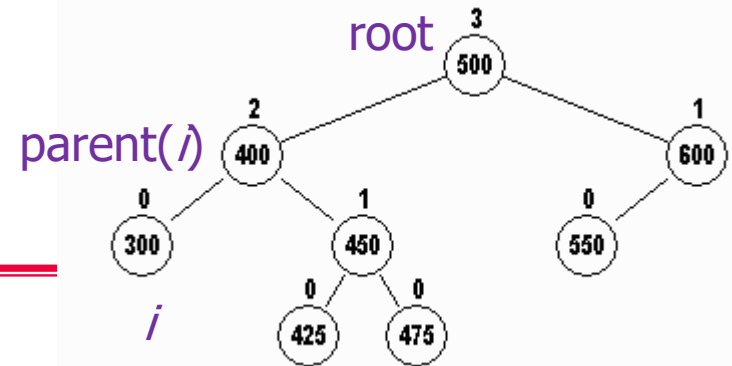


Exercise 0

寫出完全二元樹的特性。

Heap特性

Heap property



- **Max-heap** : $A[\text{parent}(i)] \geq A[i]$ ——— 爸爸永遠比兒子大
- **Min-heap** : $A[\text{parent}(i)] \leq A[i]$
- The **height of a node** in a tree: the number of edges on the longest simple downward path from the node to a leaf.
- The **height of a tree**: the height of the root
- The **height of a heap**: $O(\lg n)$.

節點高度 = #從該節點至最遠的leaf的邊

樹的高度 = root的高度

Basic procedures on heap Heap基本運算

- **Max-Heapify** $\rightarrow O(\lg n)$ 錐型化
 - **Build-Max-Heap** $\rightarrow O(n)$ 建立錐型
 - **Heapsort** $\rightarrow O(n \lg n)$ 錐型排序
 - **Max-Heap-Insert**
 - **Heap-Extract-Max**
 - **Heap-Increase-Key**
 - **Heap-Maximum** $\rightarrow O(1)$
- 找最大
- 插入, 刪除最大, 鍵值升級
 $O(\lg n)$



Exercise 1~7

寫出以下演算法的執行時間複雜度：

1. Max-Heapify
2. Build-Max-Heap
3. Heapsort
4. Max-Heap-Insert
5. Heap-Extract-Max
6. Heap-Increase-Key
7. Heap-Maximum

Exercise 8

Is the array with values $\langle 23, 17, 14, 6, 13, 10, 1, 5, 7, 12 \rangle$ a max-heap?

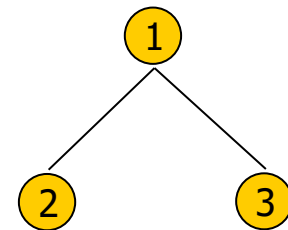


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6.2 Maintaining the heap property

- **Heapify** is an important subroutine for manipulating heaps.
錐型化為heap之重要操弄動作
- Its **inputs** are an **array A** and an **index i** in the array.
輸入一陣列 A , 及索引值 i
- When Heapify is called, it is **assume** that 何時需錐型化?
 - ✓ the binary trees rooted at **$LEFT(i)$** and **$RIGHT(i)$** are **heaps**,
 - ✓ but that **$A[i]$** may be **smaller than** its **children**,
 - ✓ thus violating the heap property.

節點 i 的左右子樹皆為 heap,
但 i 的鍵值比兒子小



Max-Heapify (A, i)

1 $l \leftarrow \text{Left}(i)$

2 $r \leftarrow \text{Right}(i)$

3 if $l \leq A.\text{heap-size}$ and $A[l] > A[i]$

4 then $\text{largest} \leftarrow l$

5 else $\text{largest} \leftarrow i$

6 if $r \leq A.\text{heap-size}$ and $A[r] > A[\text{largest}]$

7 then $\text{largest} \leftarrow r$

8 if $\text{largest} \neq i$

9 then exchange $A[i] \leftrightarrow A[\text{largest}]$

10 **Max-Heapify** (A, largest)

$$*T(n) \leq T\left(\frac{2n}{3}\right) + \Theta(1) \Rightarrow T(n) = O(\lg n)$$

Alternatively $O(h)$ (h: height)

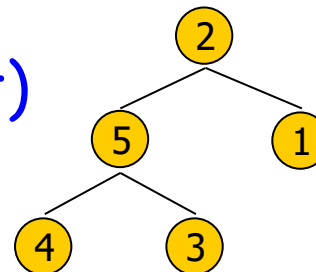
(Line 3-7) 爸爸跟兩個兒子
比大小，誰比較大誰就是爸爸。

如果節點i不是最大

i往下掉

遞迴 呼叫 **Heapify**

W.C: 最底層
恰好是半滿時



Exercise 9

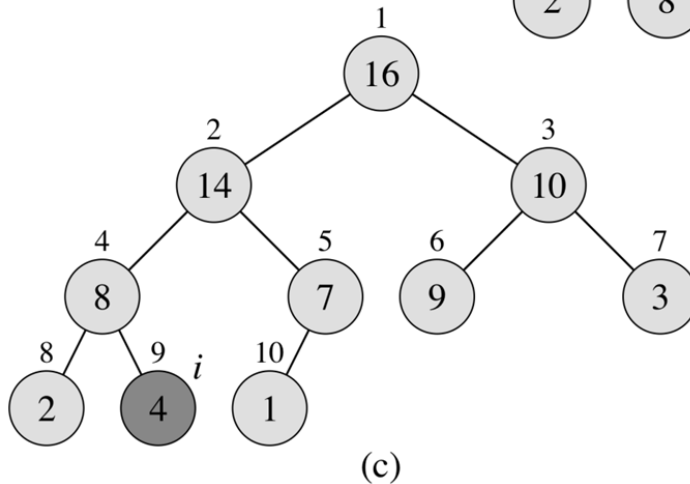
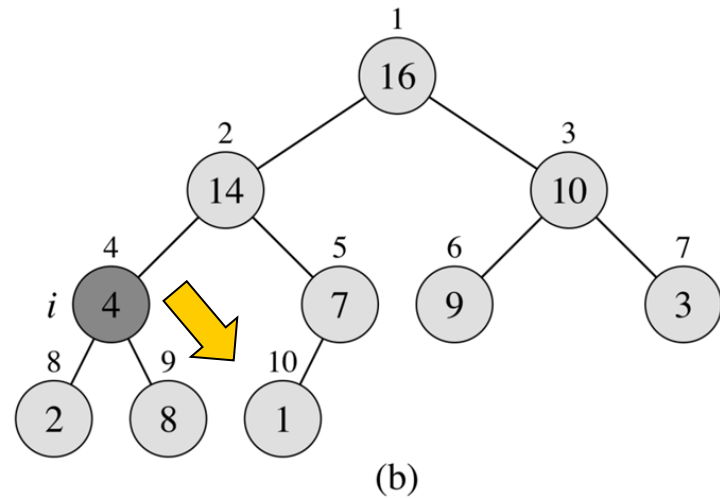
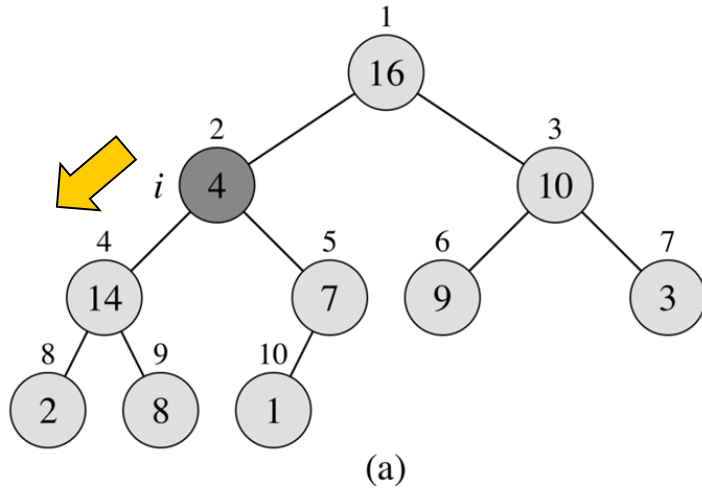
用自己的話寫出Max_Heapify執行步驟。

Exercise 10

寫出 `Max_Heapify` 演算法的遞迴式，並求算將 $T(n)$ 以 Big-O 表示的結果。

Max-Heapify(A, 2)

A.heap-size = 10



Exercise 11

- 試畫出以 $\text{Max-Heapify}(A, 3)$ 應用於以下陣列的過程。

$A = \langle 27, 17, 3, 16, 13, 10, 1, 5, 7, 12, 4, 8, 9, 0 \rangle$

$\text{MAX-HEAPIFY}(A, i, n)$

$l = \text{LEFT}(i)$

$r = \text{RIGHT}(i)$

if $l \leq n$ and $A[l] > A[i]$

$\quad largest = l$

else $largest = i$

if $r \leq n$ and $A[r] > A[largest]$

$\quad largest = r$

if $largest \neq i$

$\quad \text{exchange } A[i] \text{ with } A[largest]$

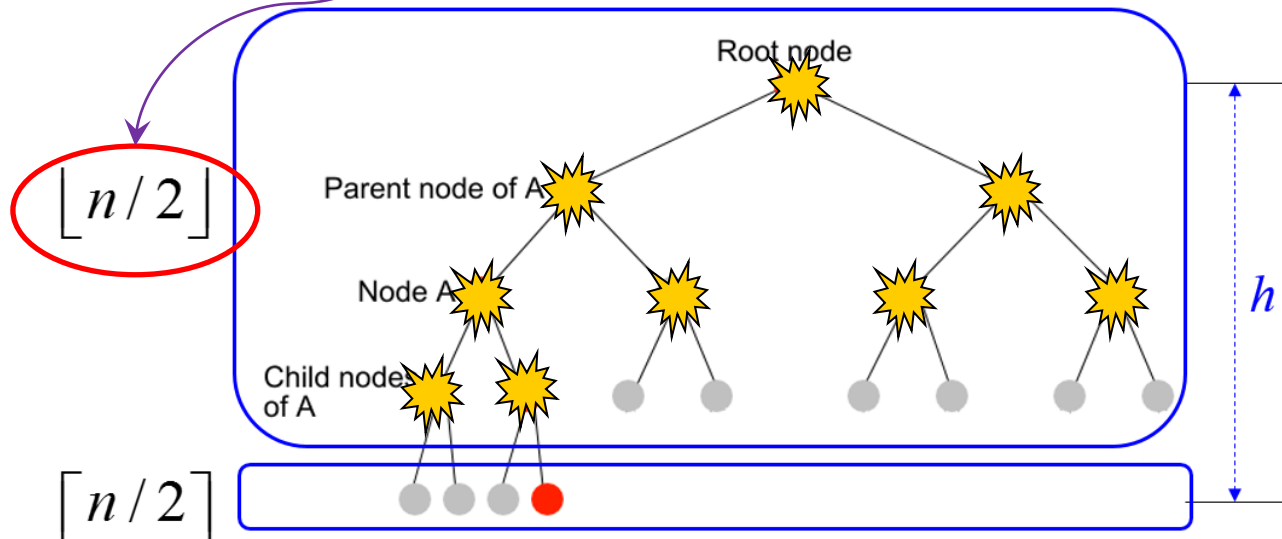
$\quad \text{MAX-HEAPIFY}(A, largest, n)$

6.3 Building a heap

Build-Max-Heap(*A*)

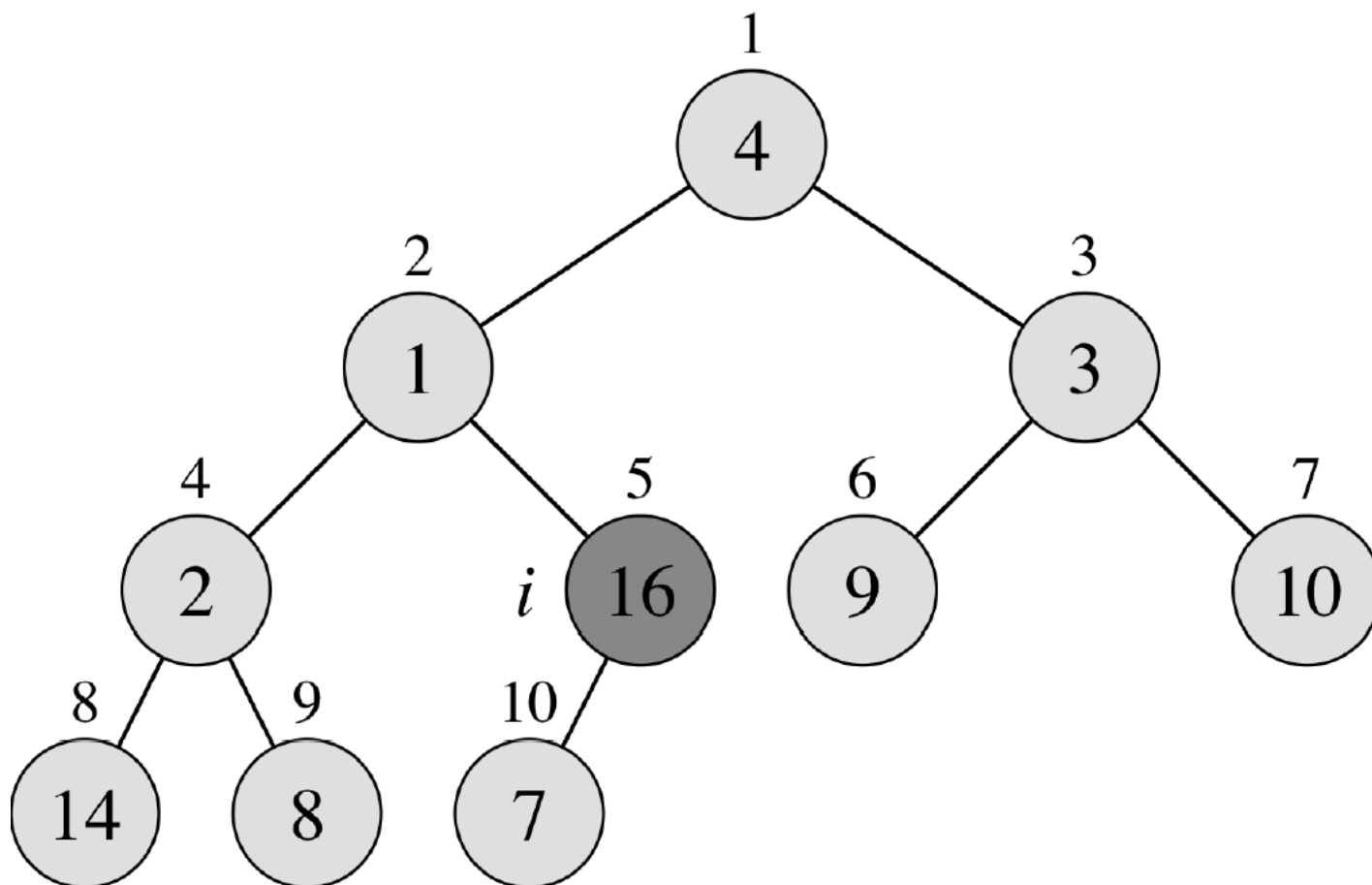
從最後一個 **Non-Leaf** 開始做 Heapify。

```
1  A.heap_size ← A.length
2  for i ←  $\lfloor \text{A.length}/2 \rfloor$  downto 1
3    do Max-Heapify(A, i)
```



A

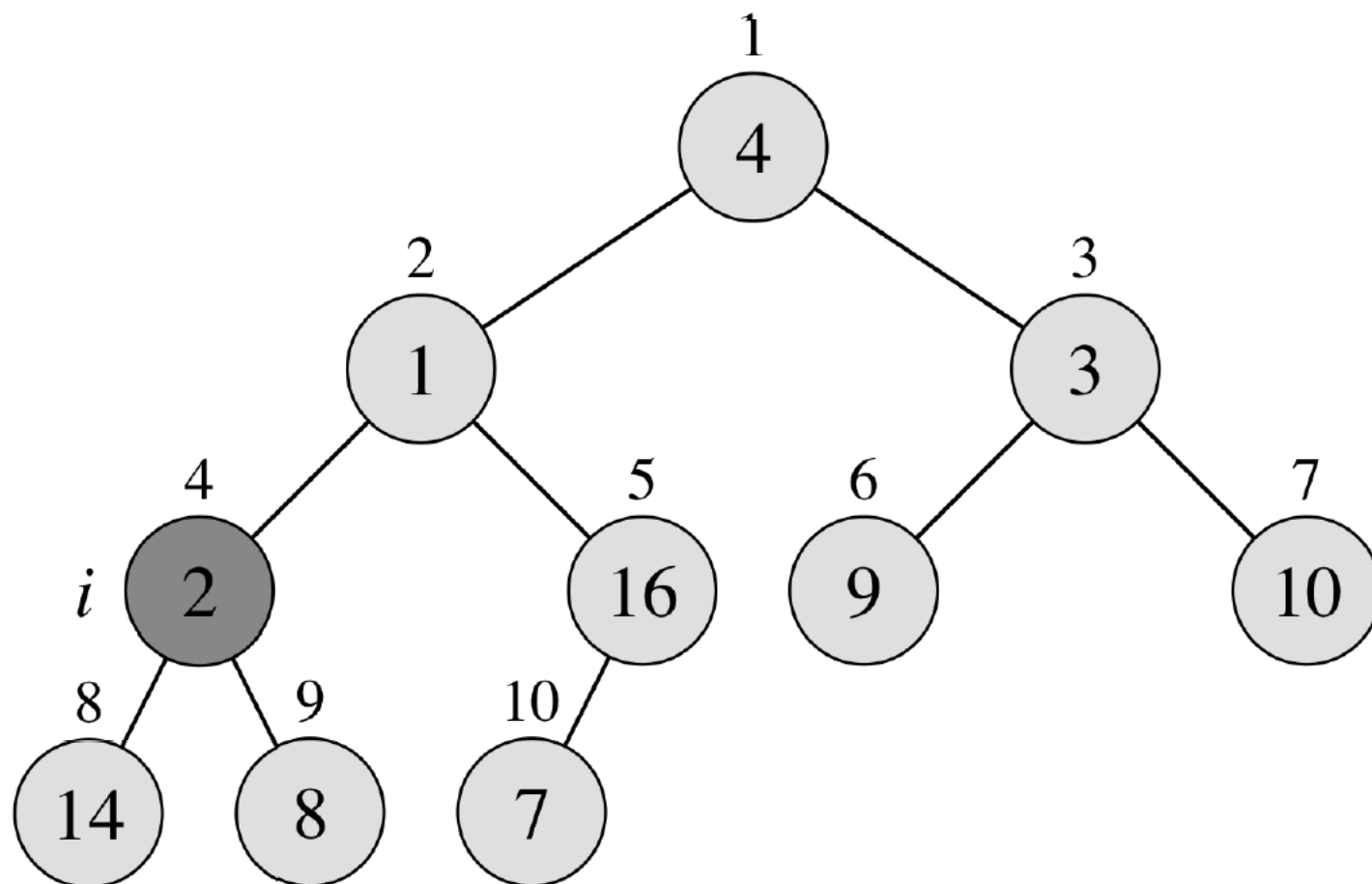
4	1	3	2	16	9	10	14	8	7
---	---	---	---	----	---	----	----	---	---



(a)

A

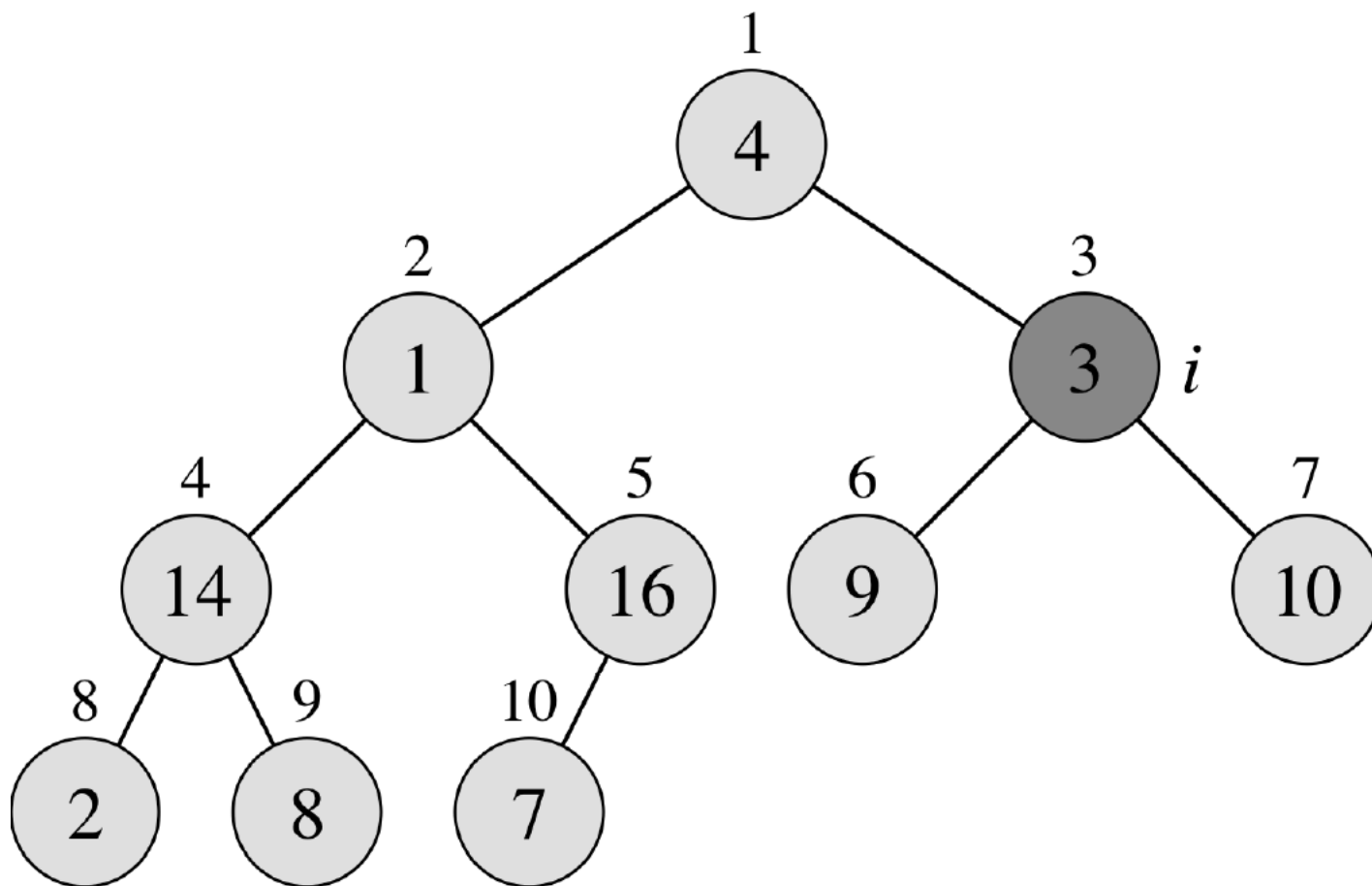
4	1	3	14	16	9	10	2	8	7
---	---	---	----	----	---	----	---	---	---



(b)

A

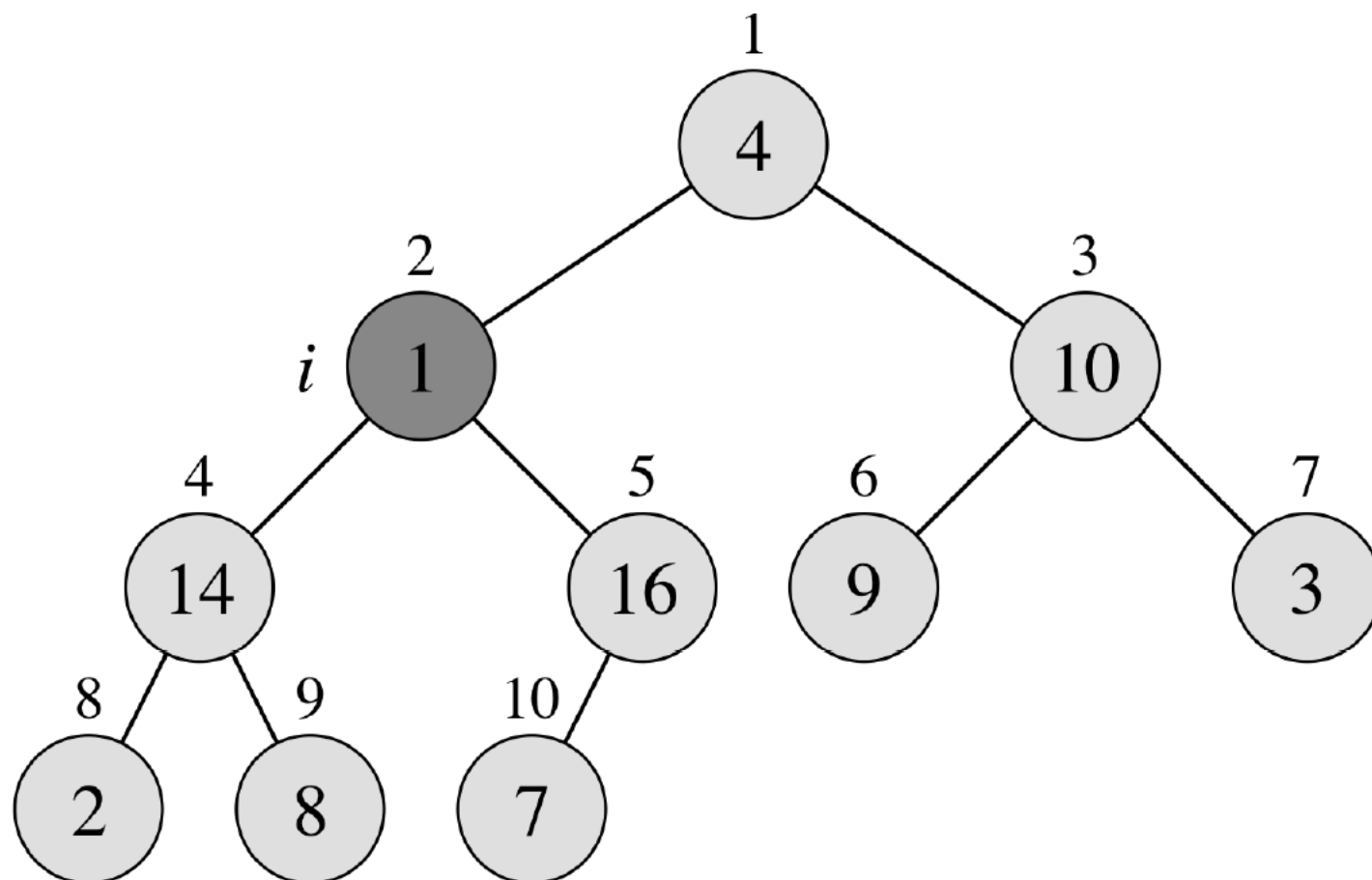
4	1	10	14	16	9	3	2	8	7
---	---	----	----	----	---	---	---	---	---



(c)

A

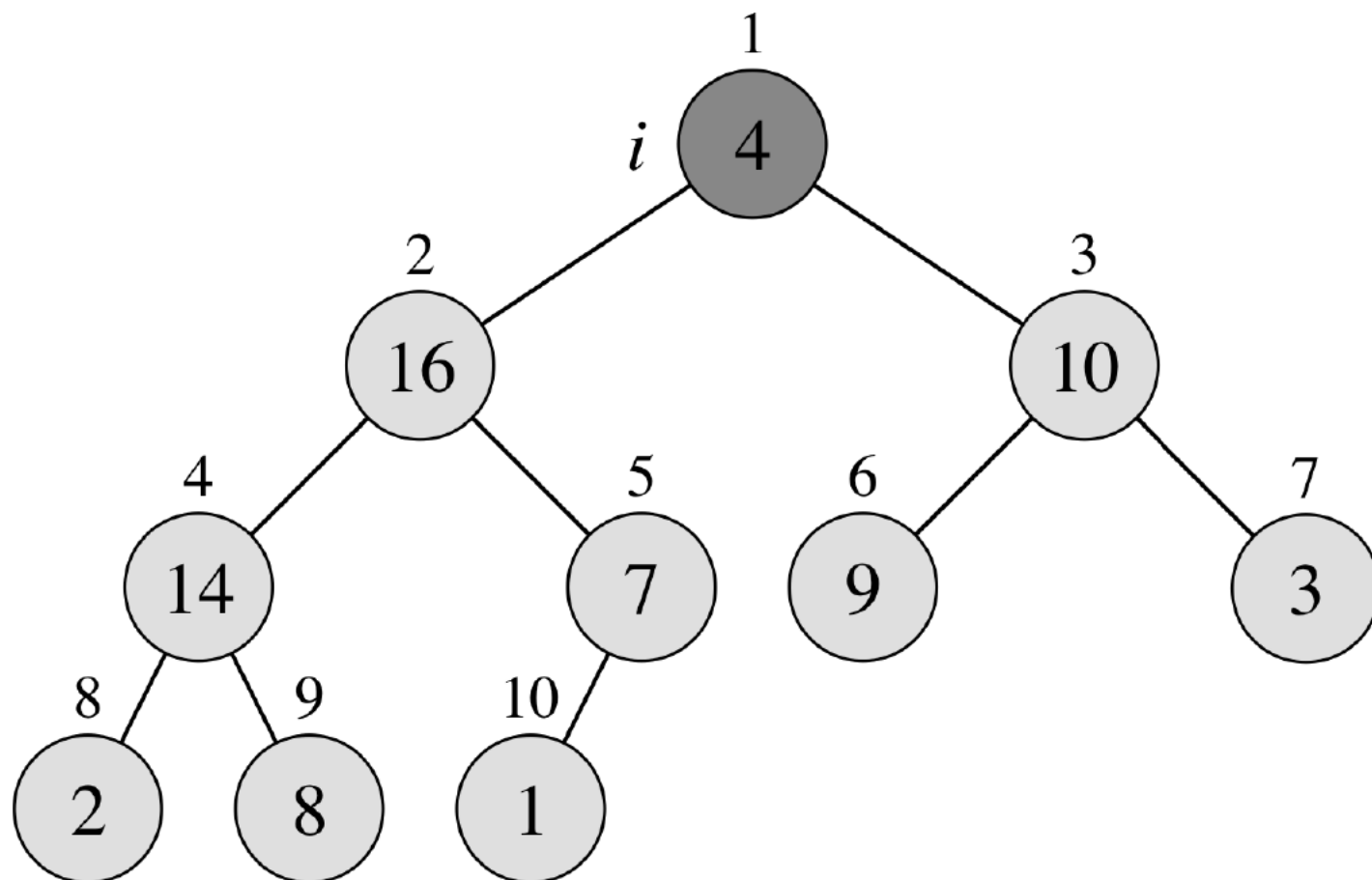
4	16	10	14	7	9	3	2	8	1
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(d)

A

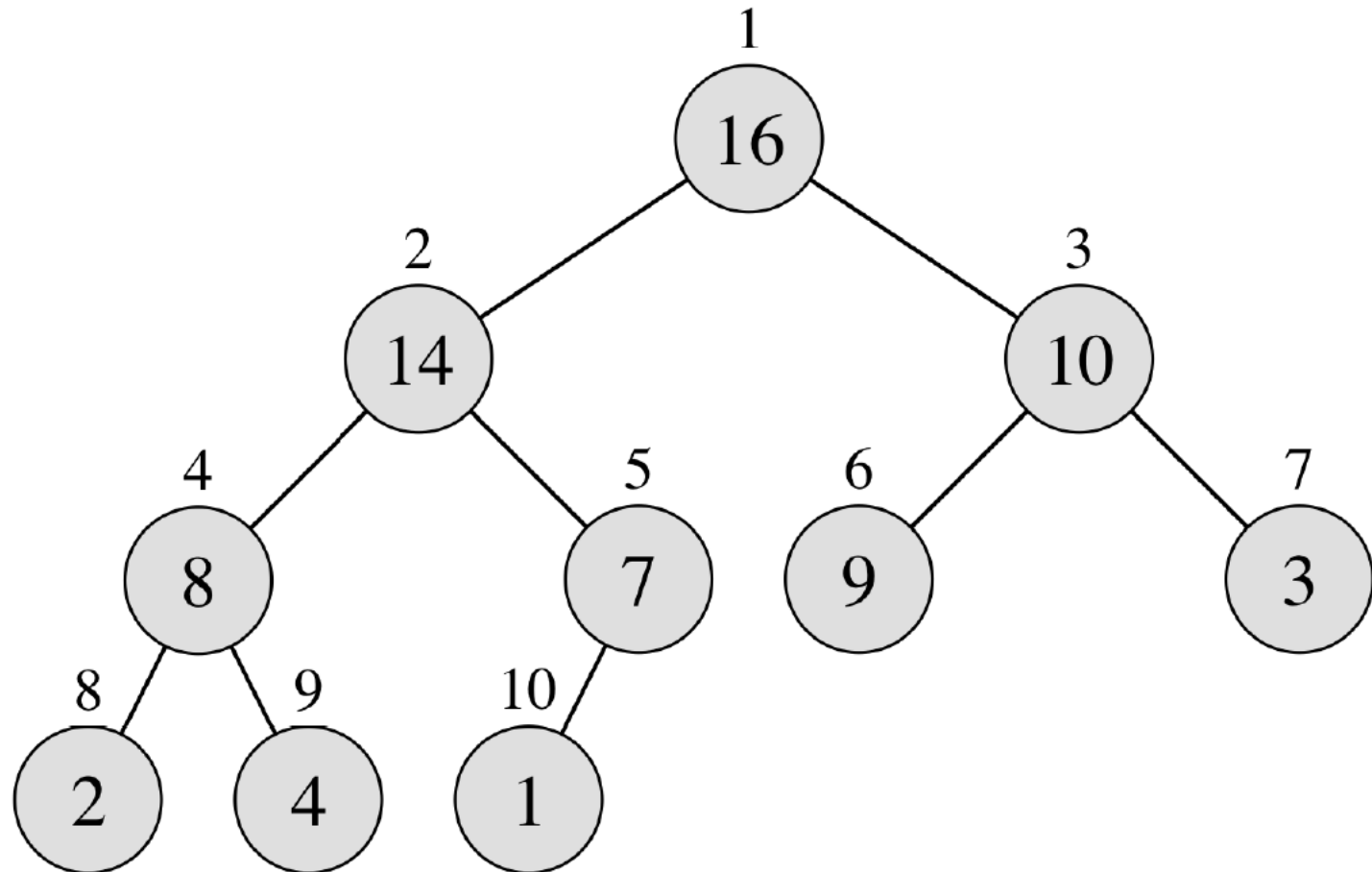
4	16	10	14	7	9	3	2	8	1
---	----	----	----	---	---	---	---	---	---



(e)

A

16	14	10	8	7	9	3	2	4	1
----	----	----	---	---	---	---	---	---	---



(f)

Tight Bound 注意太棒!

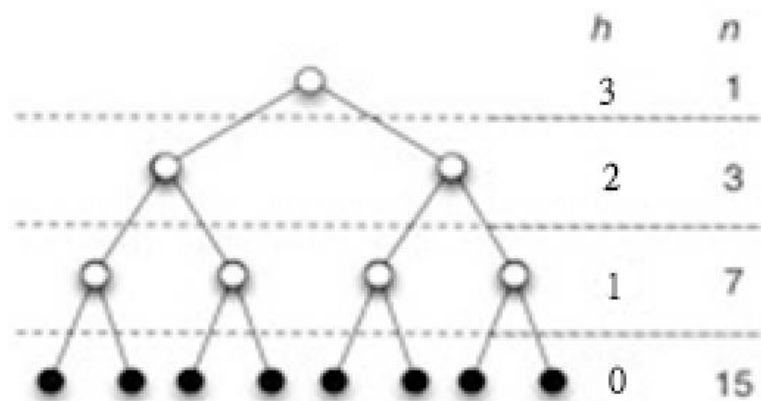
➤ By observation 觀察法

$$O(n \lg n)?$$

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

$$\sum_{h=0}^{\infty} \frac{h}{2^h} = 2 \quad \left(\because \sum_{k=0}^{\infty} kx^k = \frac{x}{(1-x)^2} \right)$$

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



At most $\lceil n / 2^{h+1} \rceil$ nodes at height h

高度為h的節點最多有幾個

(A.8)

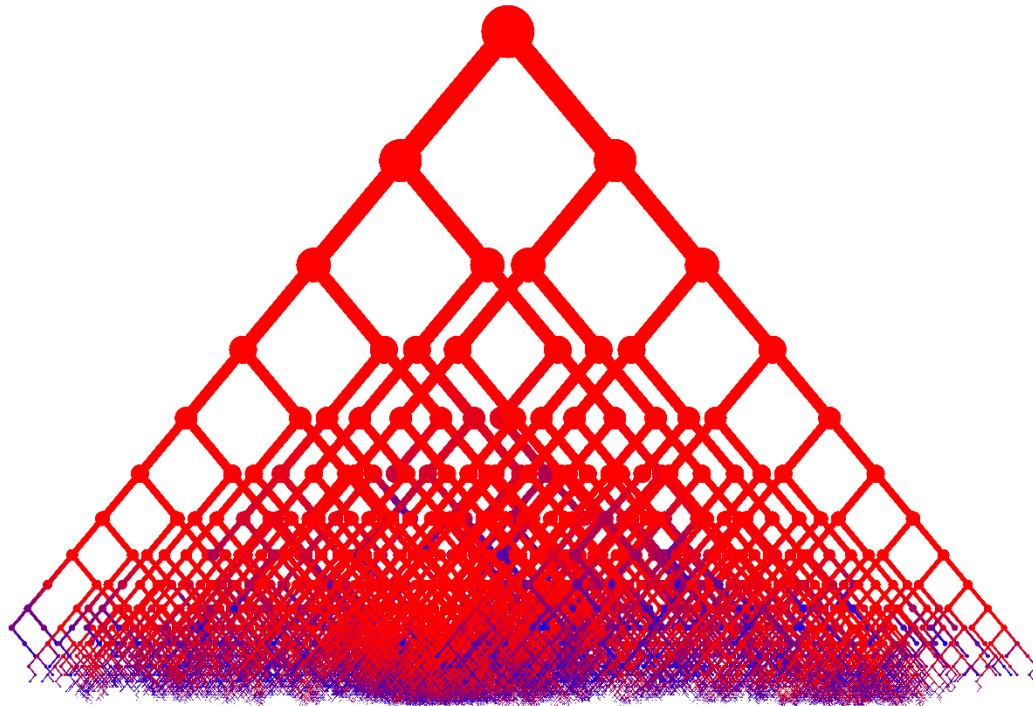
BuildHeap
只需線性時間



Exercise 12

- 試畫出以Build-Max-Heap 演算法為以下陣列建立Heap的過程。

$A = \langle 5, 3, 17, 10, 84, 19, 6, 22, 9 \rangle$



6.4 The Heapsort algorithm

Heapsort(A)

先Build-Heap $\rightarrow O(n)$

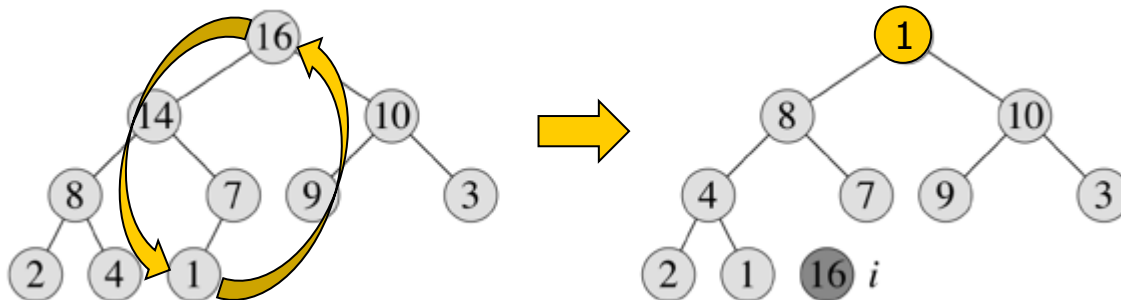
1 **Build-Max-Heap(A)**

2 for $i \leftarrow A.length$ down to 2

3 do exchange $A[1] \leftrightarrow A[i]$

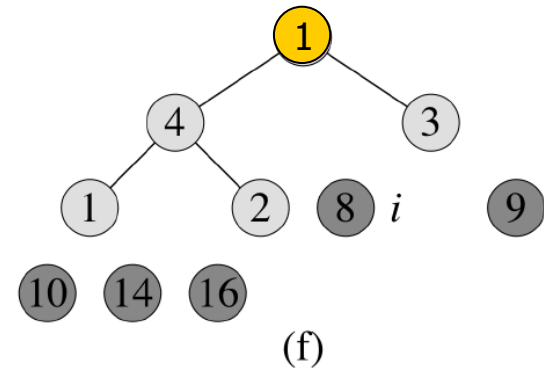
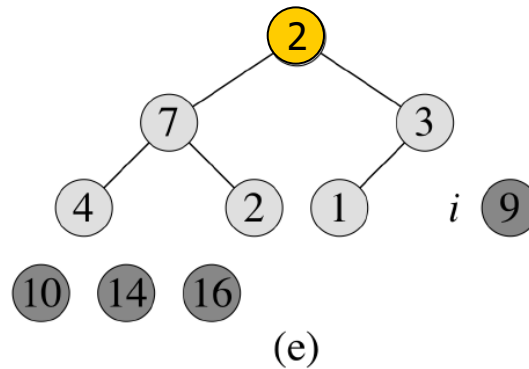
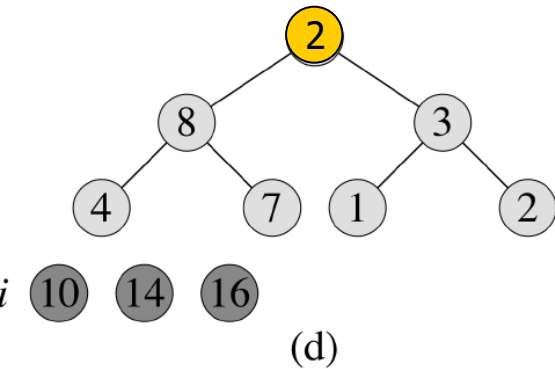
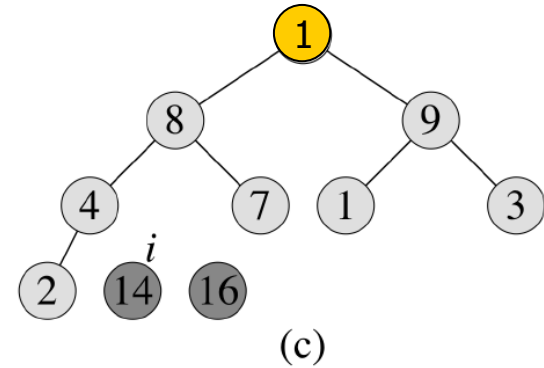
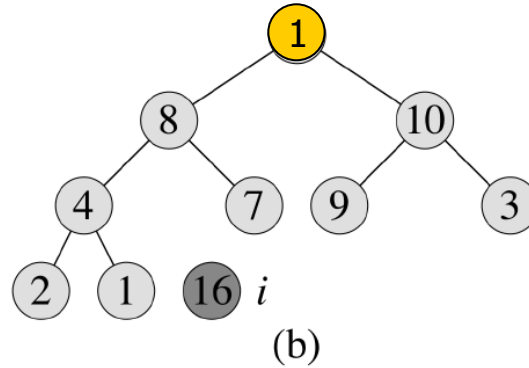
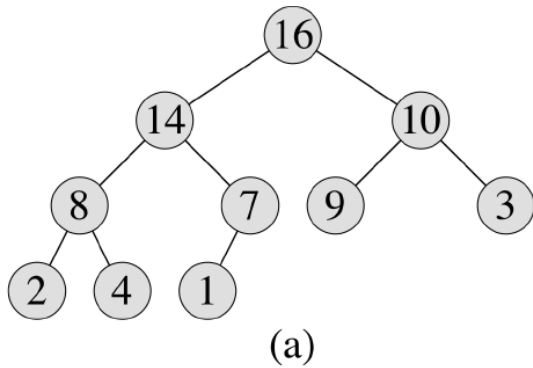
4 $A.heap-size \leftarrow A.heap-size - 1$

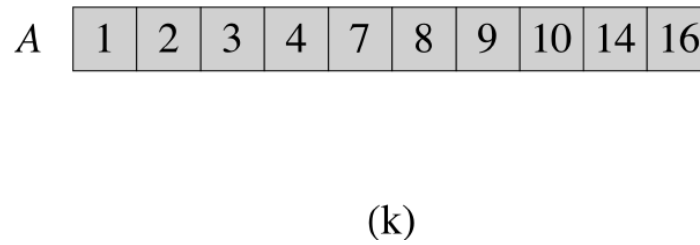
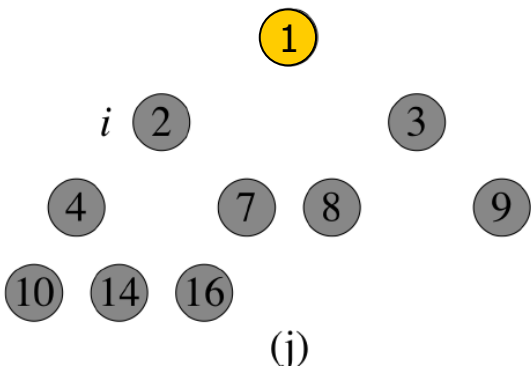
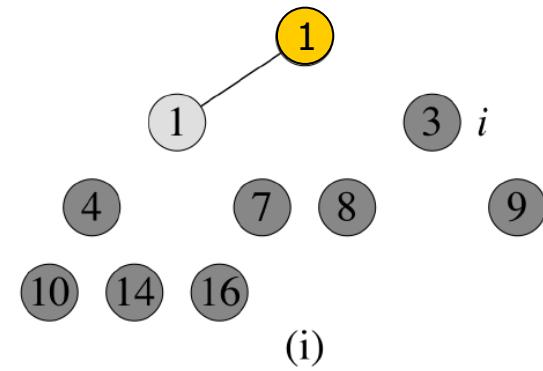
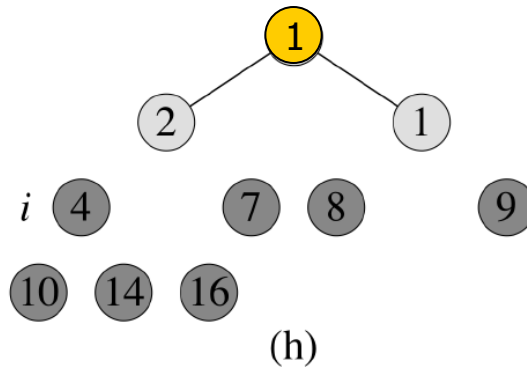
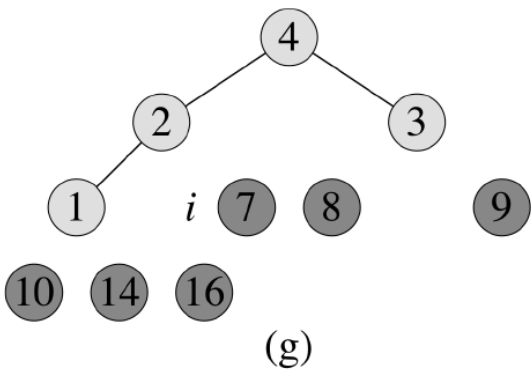
5 **Max-Heapify(A, 1)**



再從最後一個 **Node** 開始，
把每個 Node 跟 Root 交換，
再對 Root 做 Heapify
 $\rightarrow O(\lg n)$ 做 n 次。

The operation of Heapsort



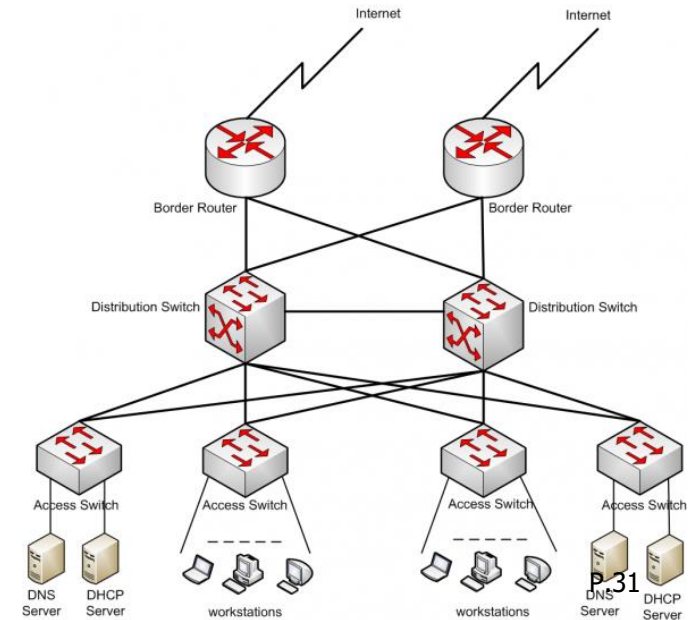


Analysis: $O(n \lg n)$

Analysis of HeapSort

1. Build-Max-Heap: $O(n)$
 2. for loop: $n-1$ times $O(n)$
 3. exchange elements: $O(1)$
 4. Max-Heapify: $O(\lg n)$
- $\left. \begin{array}{l} O(1) \\ O(\lg n) \end{array} \right\} O(\lg n)$ $\left. \begin{array}{l} O(\lg n) \\ O(n) \end{array} \right\} O(n)$

➤ Total time: $O(n \lg n)$



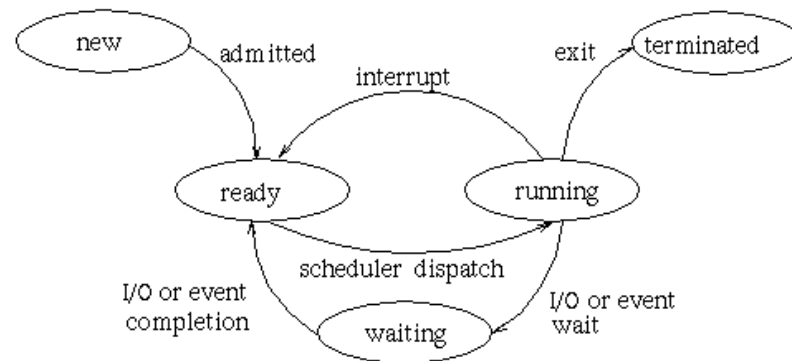
Exercise 13

- 寫出Heapsort演算法並逐行分析其執行時間複雜度。

6.5 Priority queues 優先佇列(Heap之應用)

A **priority queue** is a data structure that maintain a **set** S of elements, each with an associated value call a **key**. A **max-priority queue** support the following operations: 優先佇列: PQ

- **INSERT** (S, x) **$O(\lg n)$** 插入
- **MAXIMUM** (S) **$O(1)$** 找最大
- **EXTRACT-MAX** (S) **$O(\lg n)$** 刪最大
- **INCREASE-KEY** (S, x, k) **$O(\lg n)$** 鍵(優先權)升級



Exercise 14

- 寫出priority queue的4個基本運算及其執行時間複雜度。

HEAP-EXTRACT-MAX(*A*)

- | | | |
|---|---|---|
| 1 | if heap_size[<i>A</i>] < 1 | (1) 先確認 heap 裡有東西. |
| 2 | then error “heap underflow” | |
| 3 | max \leftarrow <i>A</i> [1] | (2) 備份(複製) root. |
| 4 | <i>A</i> [1] \leftarrow <i>A</i> [<i>A</i> .heap_size] | (3) 把最後一個節點搬到 root. |
| 5 | <i>A</i> .heap_size \leftarrow
<i>A</i> .heap_size - 1 | |
| 6 | MAX-HEAPIFY (<i>A</i> , 1) | (4) Heapify, with one fewer node . |
| 7 | return max | (5) Return the max element. |



$O(\lg n)$

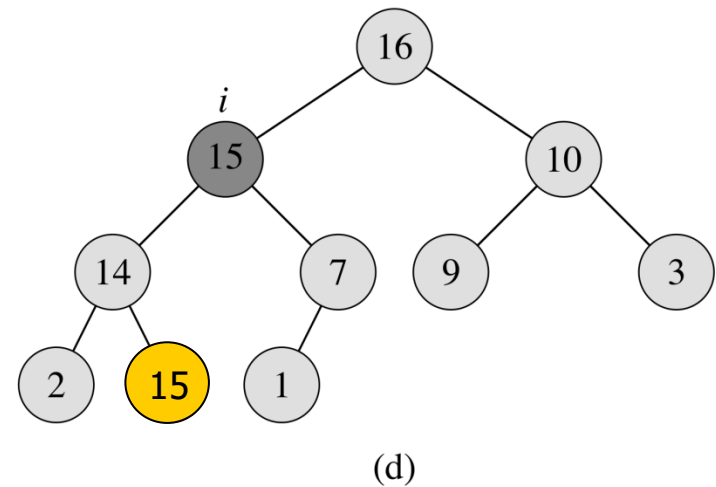
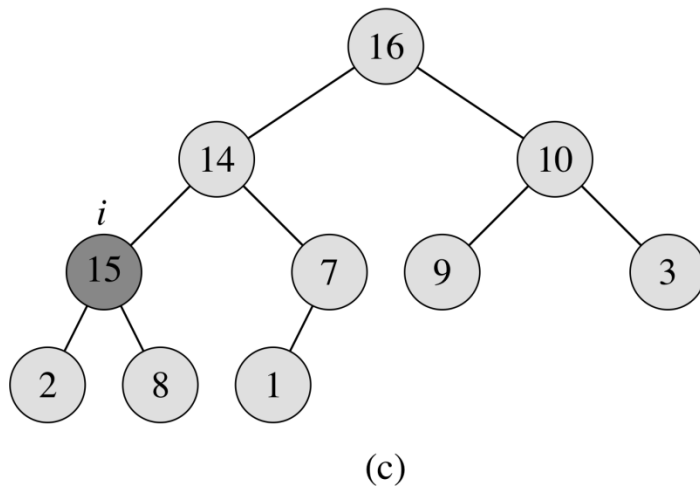
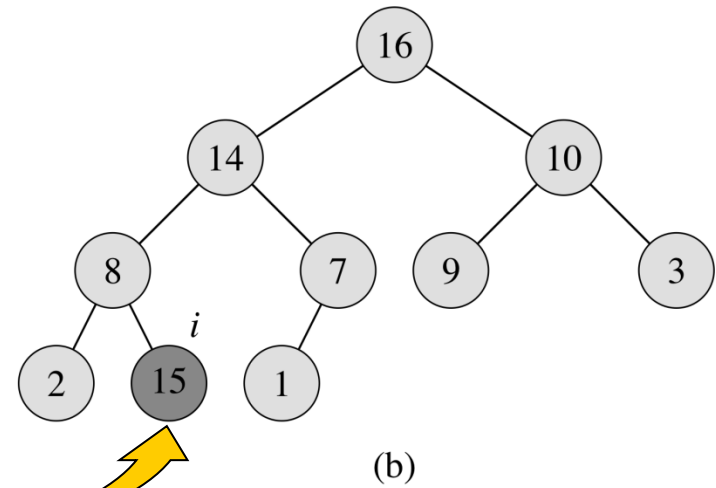
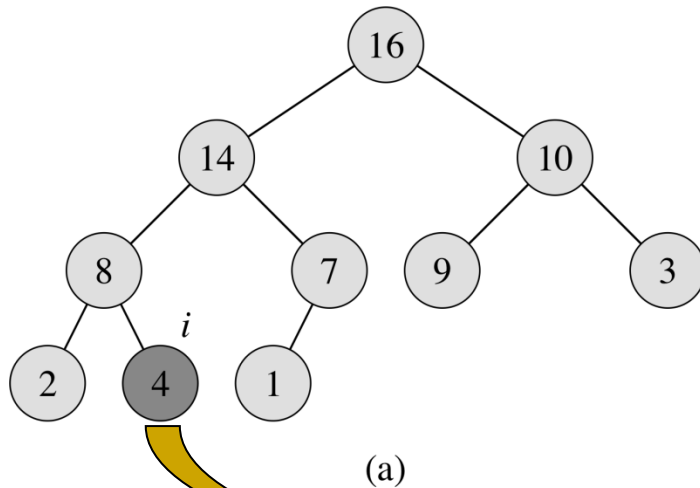
HEAP-INCREASE-KEY (A, i, key)

```
1  if  $key < A[i]$ 
2    then error “new key is smaller than current key”
3   $A[i] \leftarrow key$ 
4  while  $i > 1$  and  $A[\text{PARENT}(i)] < A[i]$ 
5    do exchange  $A[i] \leftrightarrow A[\text{PARENT}(i)]$ 
6     $i \leftarrow \text{PARENT}(i)$ 
```

如果 Node i 的鍵值比爸爸大就往上跑
最多可能從最底層到root

Total time: $O(\lg n)$

Heap-Increase-Key



HEAP-INSERT-KEY (A, key)

- 1 $heap_size[A] \leftarrow heap_size[A] + 1$
- 2 $A[heap_size[A]] \leftarrow -\infty$
- 3 **HEAP-INCREASE-KEY** ($A, heap_size[A], key$)



先插到最後一個 Node
再做 Increase-key

補充: C++ std heap_sort implementation

```
1 void heap_sort(vector<int> & A)
2 {
3     unsigned heapSize = A.size() - 1;
4     build_heap(A, heapSize);
5     for (unsigned i=heapSize; i > 0; --i) {
6         swap(A[0], A[i]);
7         heapSize -= 1;
8         heapify(A, 0, heapSize);
9     } // end of if
10 } // end of heap_sort
```

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)
```

```
1 void std_heap_sort(vector<int> & A)
2 {
3     make_heap(A.begin(), A.end() );
4     sort_heap(A.begin(), A.end() );
5 } // end of std_heap_sort
```

補充: C++ std priority_queue implementation

```
1 void std_priority_queue(vector<int> & A)
2 {
3     priority_queue<int, vector<int>, greater<int> > q;
4     for (const auto &i : A)
5         q.push(i);
6     for (vector<int>::iterator it=A.begin(); it<A.end(); ++it, q.pop() )
7         *it = q.top();
8 } // end of std_priority_queue
```

Before:

1222 6187 4111 3304 3875 1767 1360 729 587 131

After:

131 587 729 1222 1360 1767 3304 3875 4111 6187

10,9.964e-006

補充: Summary of `std::priority_queue` Operations

Operation	Notes
<code>priority_queue <T, [ctr_type<T>], [cmp_type]>([cmp], [ctr])</code>	Constructs a <code>priority_queue</code> of <code>Ts</code> using <code>ctr</code> as its internal container and <code>srt</code> as its comparator object. If no container is provided, constructs an empty deque. Uses <code>std::less</code> as default sorter.
<code>pq.empty()</code>	Returns true if container is empty.
<code>pq.size()</code>	Returns number of elements in container.
<code>pq.top()</code>	Returns a reference to the greatest element in the container.
<code>pq.push(t)</code>	Puts a copy of <code>t</code> onto the end of the container.
<code>pq.emplace(...)</code>	Constructs a <code>T</code> in place by forwarding <code>...</code> to the appropriate constructor.
<code>pq.pop()</code>	Removes the element at the end of the container.
<code>pq1.swap(pq2)</code> <code>swap(pq1, pq2)</code>	Exchanges the contents of <code>s2</code> with <code>s1</code> .

Exercise (Lab Homework)

- 用C++實作以下4個演算法來排序10,000到1,000,000個隨機亂數，並將其執行時間與 $O(n \lg n)$ 比較：
1. C++ STL內建heap_sort
 2. CLRS的Heapsort
 3. CLRS的Merge_Sort
 4. C++ STL內建的priority_queue

Summary

- Heap
- Heap property
- Height of node, height of heap
- Basic procedures on heap
 - ✓ MAX-HEAPIFY, BUILD-MAX-HEAP, HEAPSORT
 - ✓ MAX-HEAP-INSERT, HEAP-EXTRACT-MAX
 - ✓ HEAP-INCREASE-KEY, HEAP-MAXIMUM
- Priority queue
 - ✓ INSERT, MAXIMUM, EXTRACT-MAX, INCREASE-KEY