



Lecture 7: Heaps

Why Heaps ?

◆ Remember from Algorithms and Data Structure course:

■ Array

- ◆ Linear search: $O(n)$
- ◆ Insertion, deletion: $O(n)$

■ Linked list:

- ◆ Search: $O(n)$
- ◆ Insertion, deletion: $O(n)$

■ Binary search in Array:

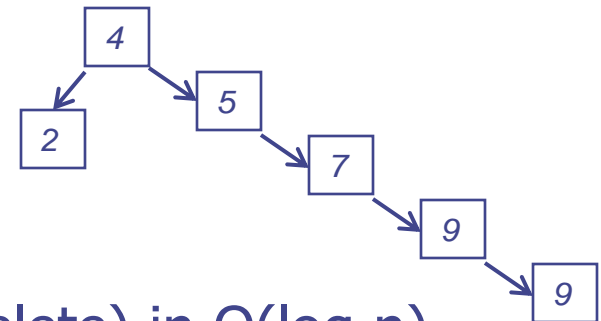
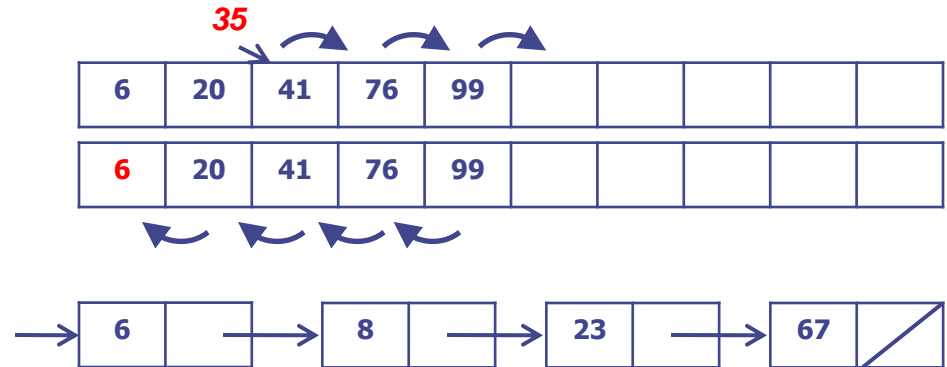
- ◆ Search: $O(\log n)$
- ◆ Insert, delete in Array: $O(n)$

■ Binary search tree

- ◆ Height may be $O(n)$
- ◆ So, search, insert, delete: $O(n)$

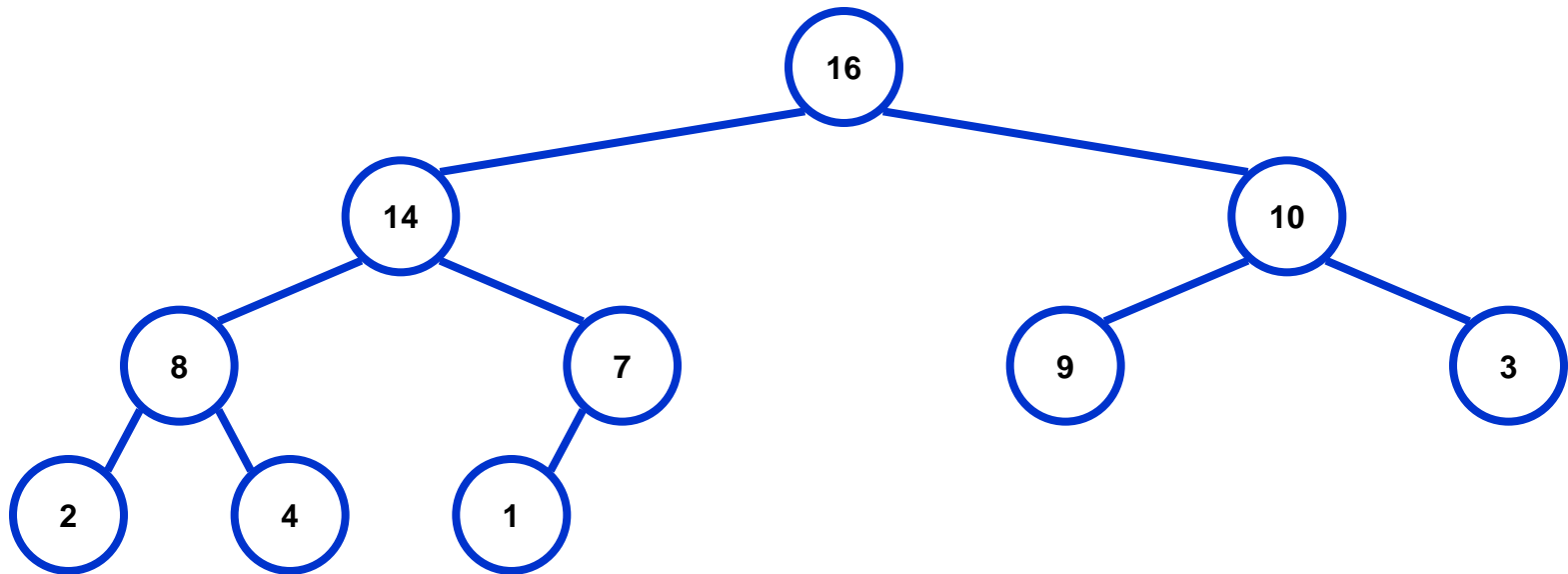
◆ Can we do everything (search, insert, delete) in $O(\log n)$ time?

- Yes, by heaps (this lecture), different Height-balanced search trees
- by Skip list (next lecture)



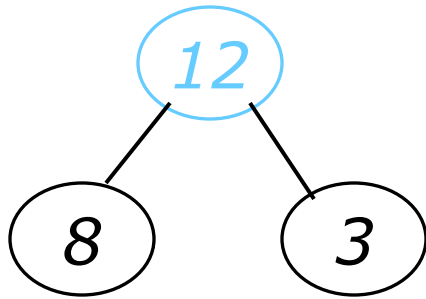
Heaps

- A *heap* can be seen as a complete binary tree (complete means: last level may be partially complete from left to right.)

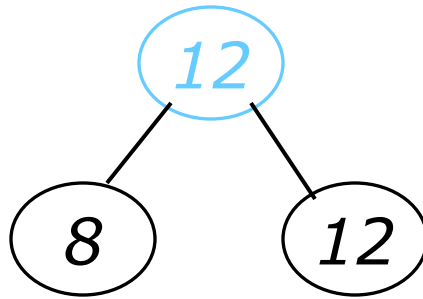


The heap property

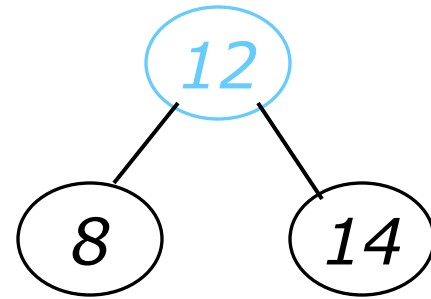
- A node has the **heap property** if the value in the node is as large as or larger than the values in its children



*Blue node has
heap property*



*Blue node has
heap property*

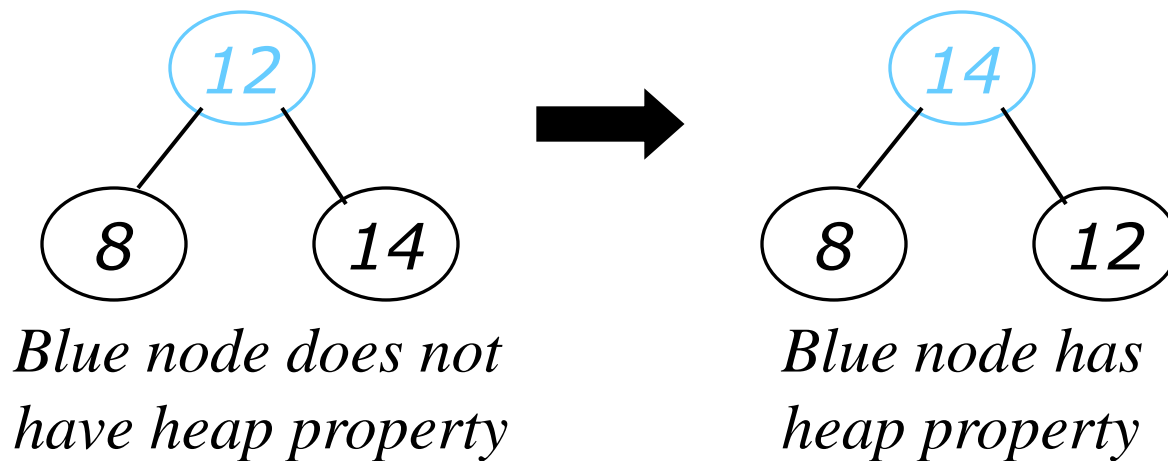


*Blue node does not
have heap property*

- All leaf nodes automatically have the heap property
- A binary tree is a **heap** if *all* nodes in it have the heap property

siftUp

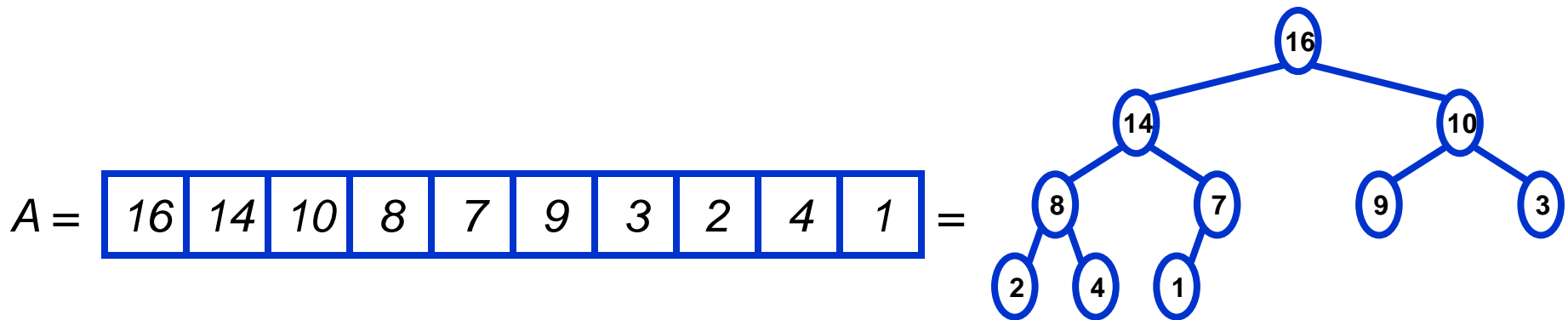
- Given a node that does not have the heap property, you can give it the heap property by exchanging its value with the value of the larger child



- This is sometimes called **sifting up**
- Notice that the child may have *lost* the heap property

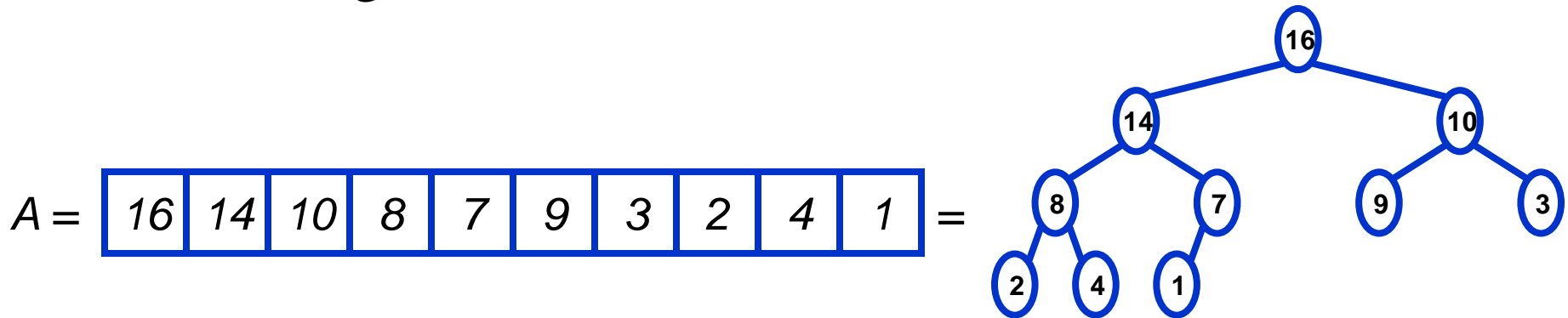
Heaps

- In practice, heaps are usually implemented as arrays (array may not be sorted):



Heaps

- To represent a complete binary tree as an array:
 - The root node is $A[1]$
 - Node i is $A[i]$
 - The parent of node i is $A[i/2]$ (note: integer divide)
 - The left child of node i is $A[2i]$
 - The right child of node i is $A[2i + 1]$



Referencing Heap Elements

- So...

```
Parent(i) { return  $\lfloor i/2 \rfloor$ ; }
```

```
Left(i) { return 2*i; }
```

```
right(i) { return 2*i + 1; }
```


Heap Property, Height

- **Heap property:**

- *Parent \geq left and right*, for all nodes
- *Where is the largest element in a heap stored?*
 - **Answer:** in the root.

***** Important***:** This is Max heap. We shall see Min heap at the end.

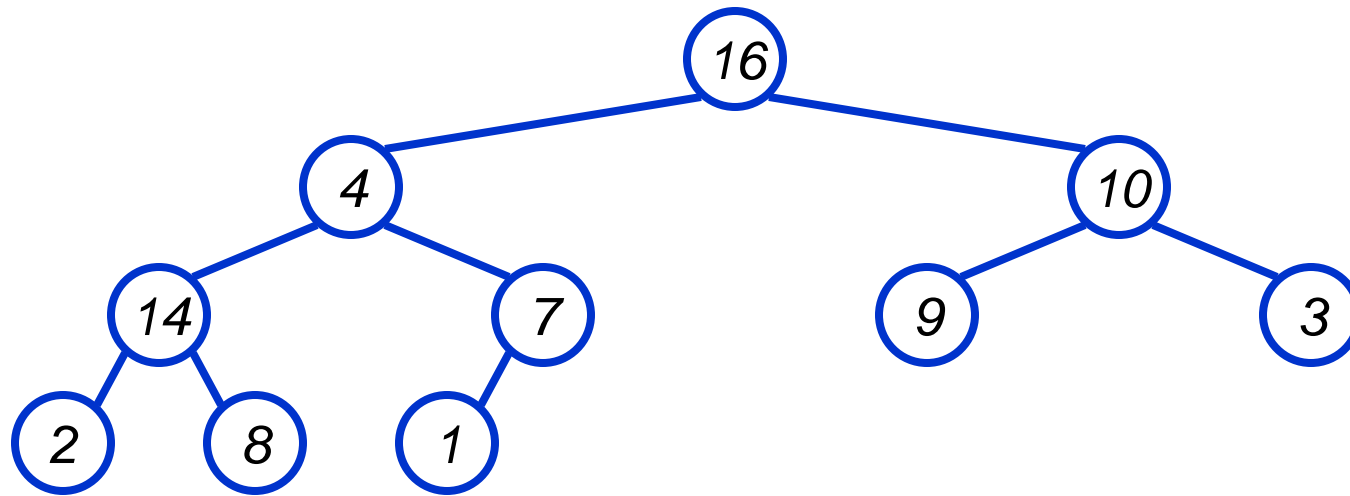
- **Heap Height:** *What is the height of an n -element heap? Why?*

- **Answer:** $O(\log n)$, because complete binary tree.

Heap Operations: Heapify() (** Very Important**)

- **Heapify()** : maintain the *heap property*
 - If a node violates the heap property, then parent node “goes down” as long as required

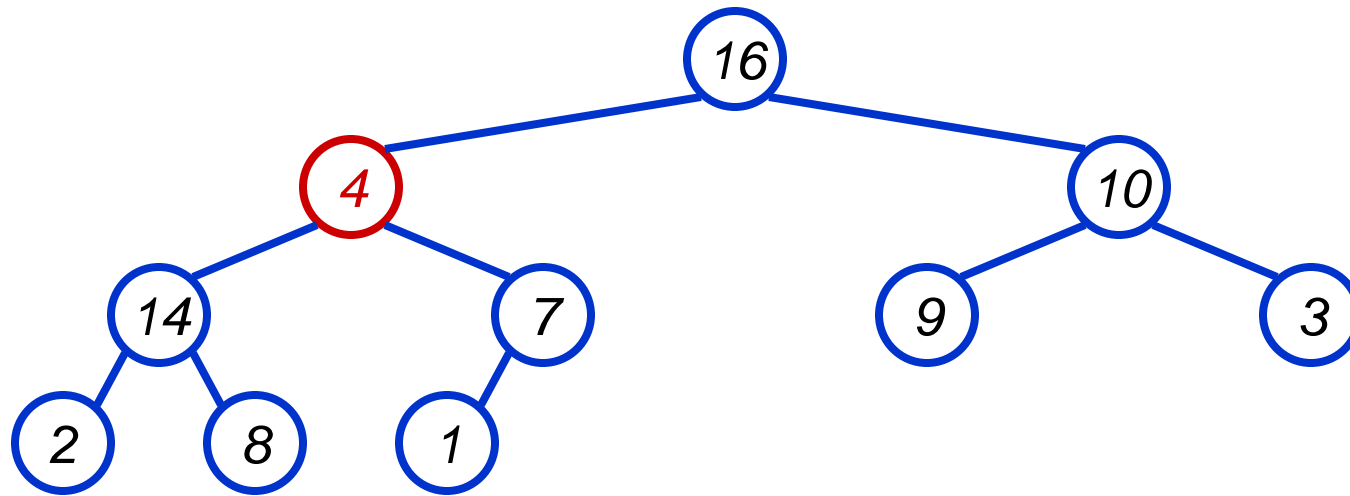
Heapify() Example



A =

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

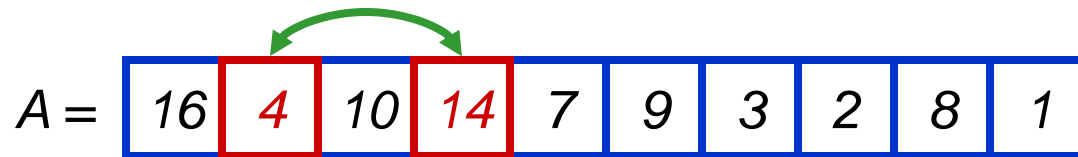
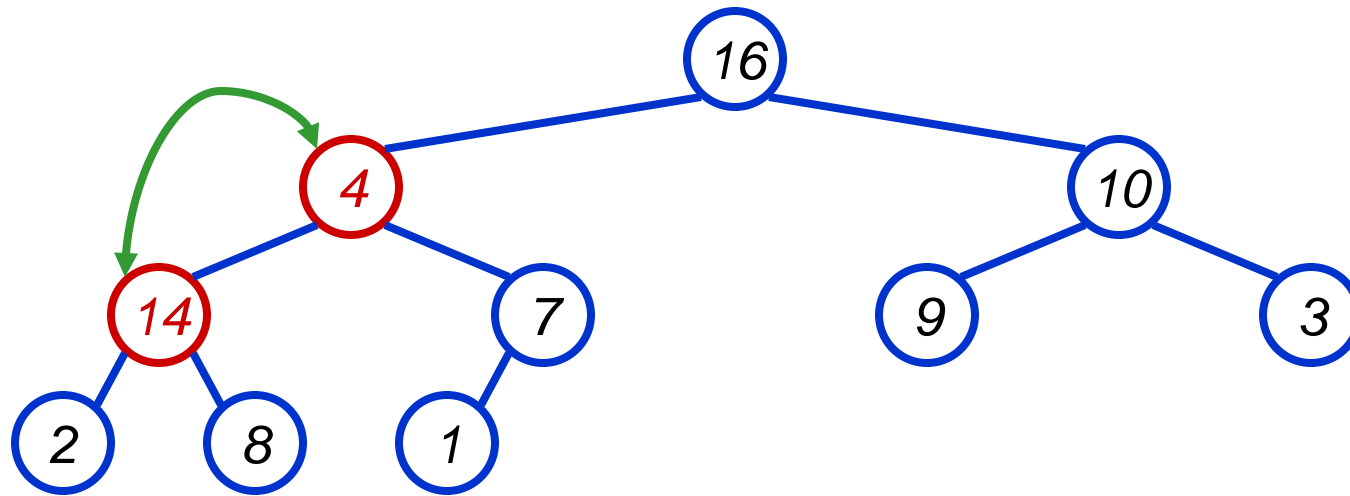
Heapify() Example



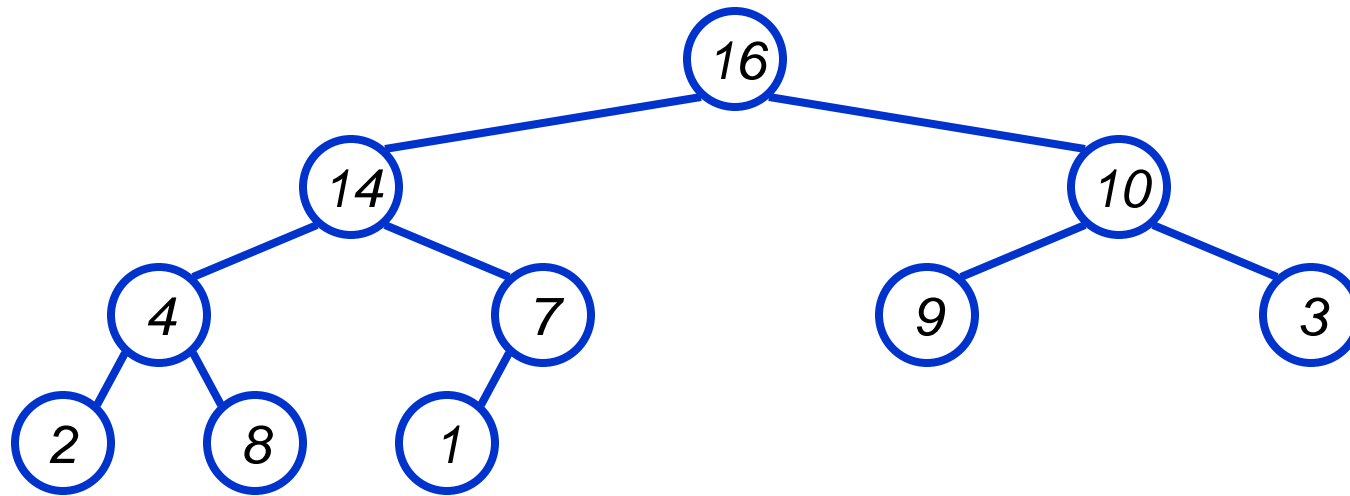
A =

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

Heapify() Example



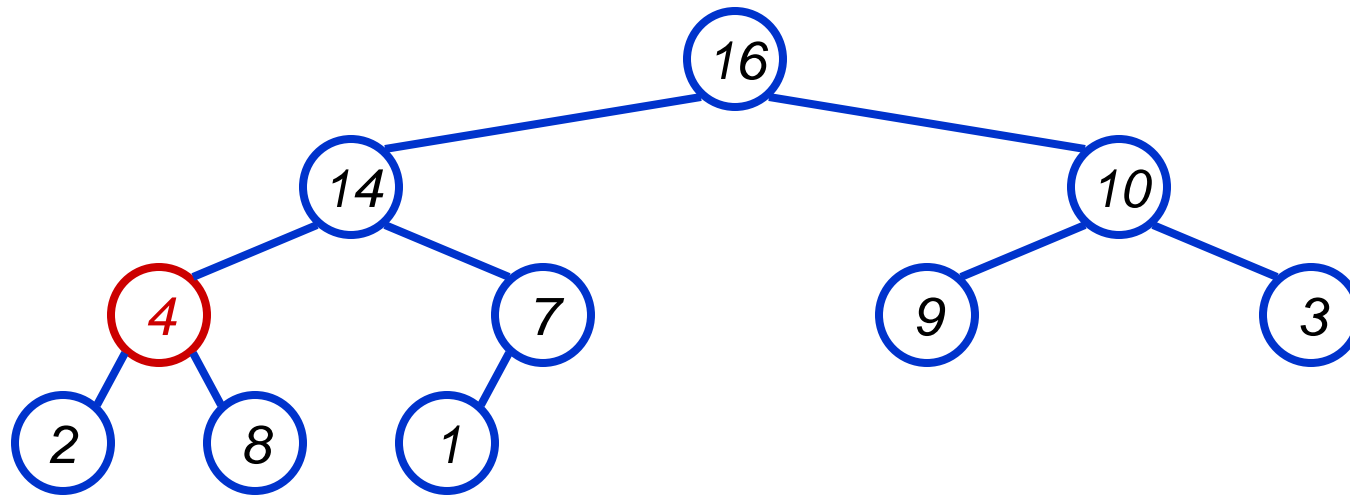
Heapify() Example



$A =$

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

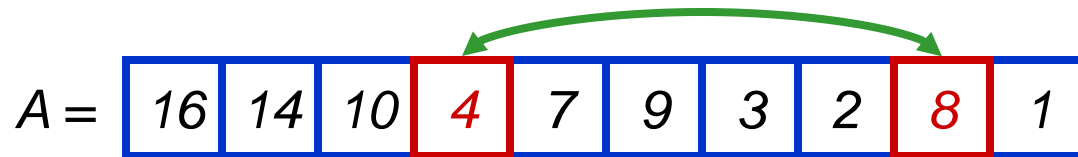
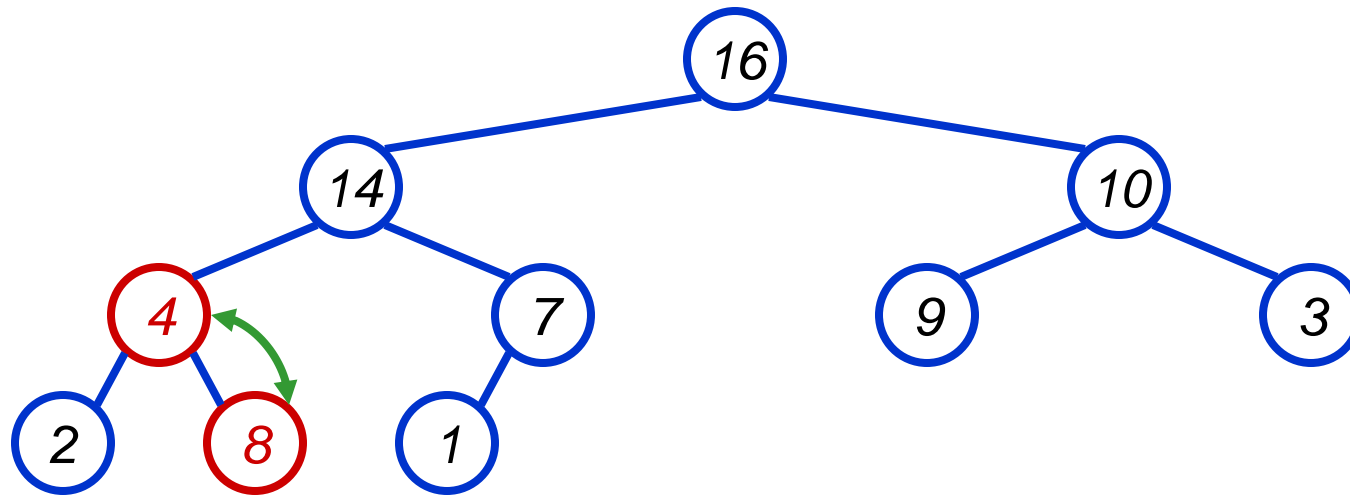
Heapify() Example



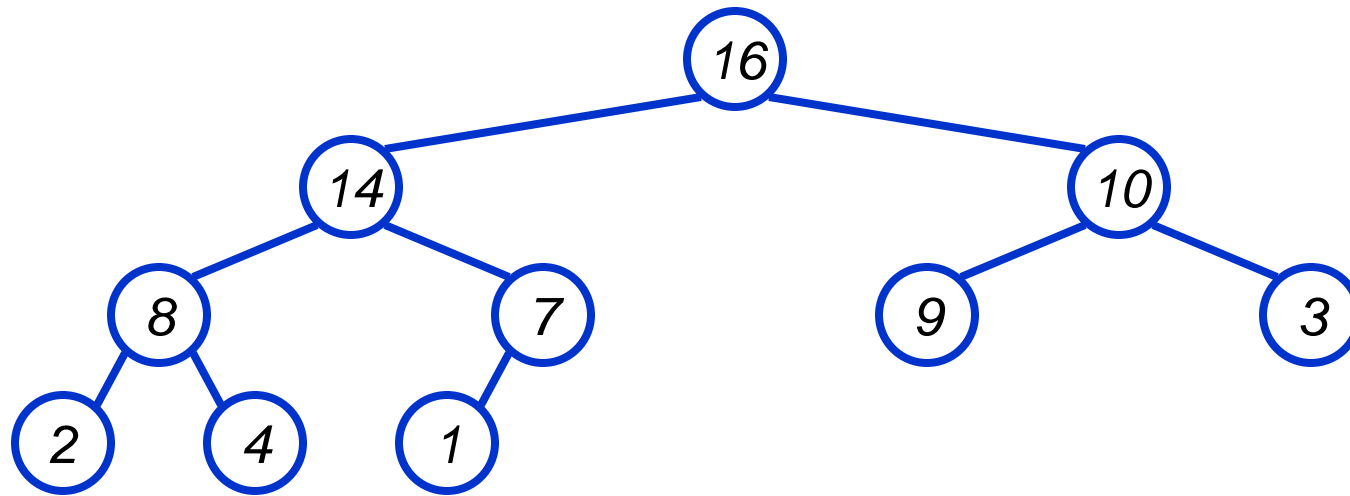
$A =$

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

Heapify() Example



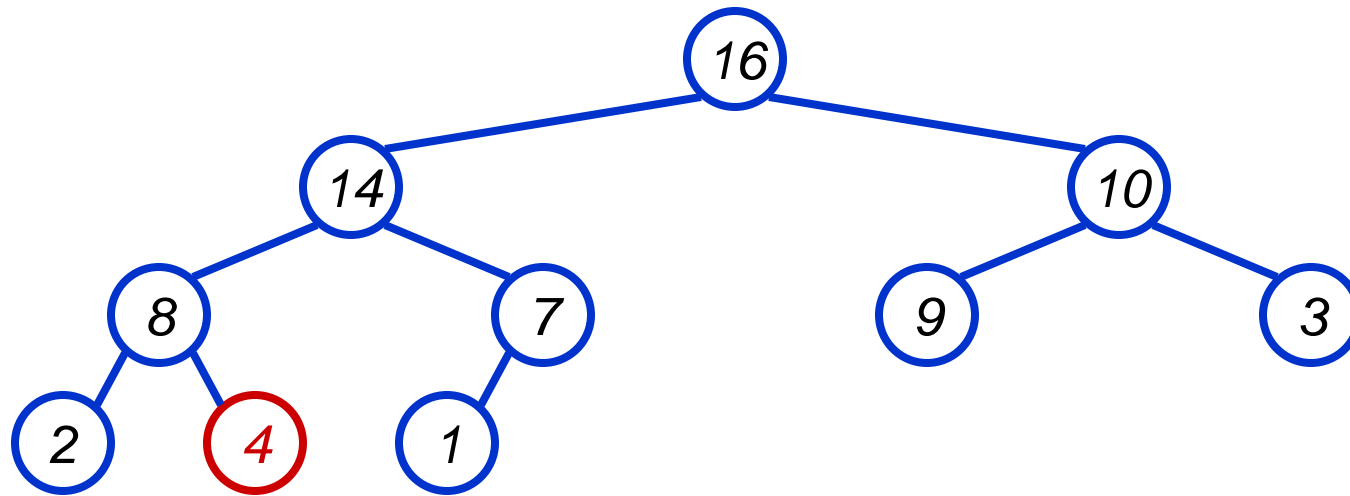
Heapify() Example



$A =$

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

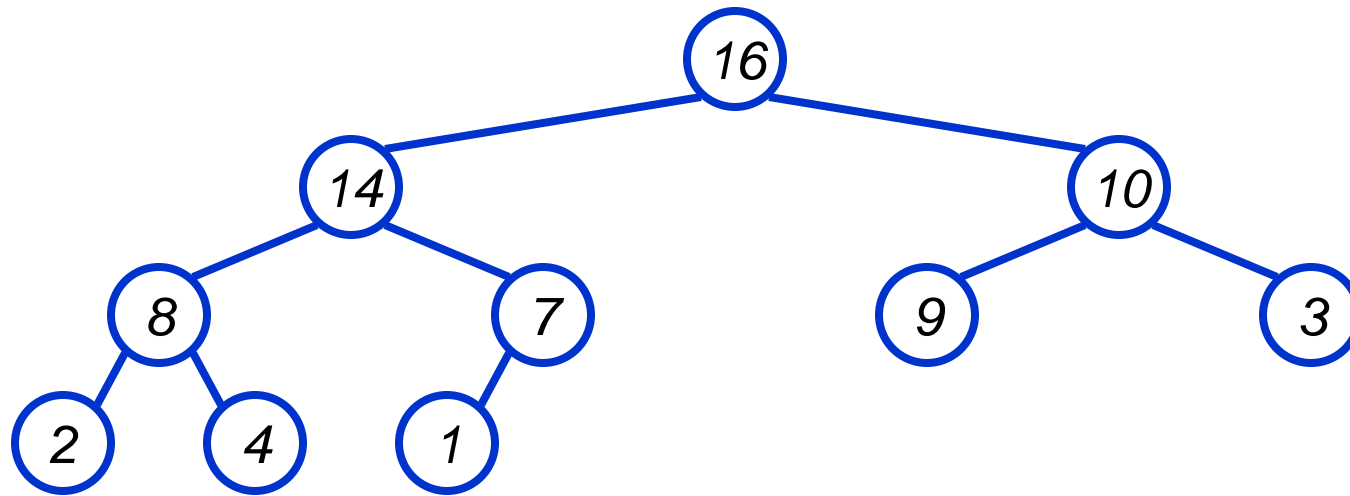
Heapify() Example



$A =$

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

Heapify() Example



A =

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

Heap Operations: Heapify()

```
Heapify(A, i)
{
    if (1 <= heap_size(A) && A[1] > A[i])
        largest = 1;
    else largest = i;
    if (r <= heap_size(A) && A[r] > A[largest])
        largest = r;
    if (largest != i)
        Swap(A, i, largest);
    Heapify(A, largest);
}
```

Running time of Heapify()

- $O(\log n)$

```
Heapify(A, i)
```

```
{
```

```
    if (1 <= heap_size(A) && A[1] > A[i])
```

```
        largest = 1;
```

```
    else largest = i;
```

```
    if (r <= heap_size(A) && A[r] > A[largest])
```

```
        largest = r;
```

```
    if (largest != i)
```

```
        Swap(A, i, largest);
```

```
        Heapify(A, largest);
```

```
}
```

Total: $O(1)$

How many times? Height = $O(\log n)$

Total = $O(1) * O(\log n) = O(\log n)$

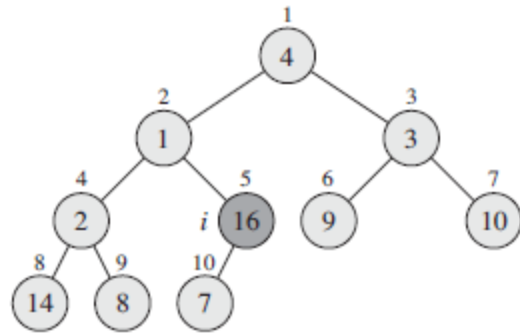
Heap Operations: BuildHeap()

- We can build a heap in a bottom-up manner by running **Heapify()** on successive subarrays
 - For array of length n , all elements in range $A[n/2 + 1 .. n]$ are already heaps, because they have no children.
 - So, walk backwards through the array from the remaining nodes $n/2$ to 1, calling **Heapify()** on each node.
 - Order of processing guarantees that the children of node i are heaps when i is processed

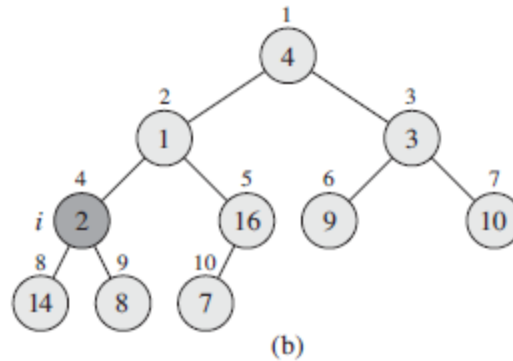
BuildHeap() Example

Starting array:

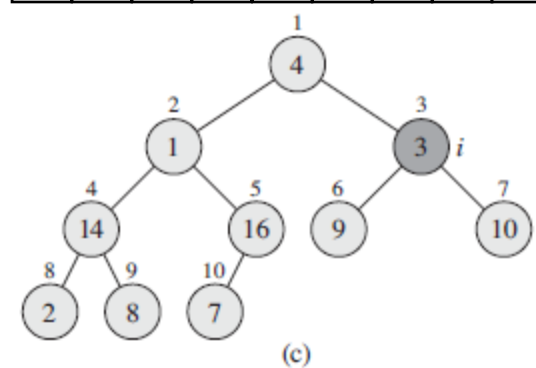
4	1	3	2	16	9	10	14	8	7
---	---	---	---	----	---	----	----	---	---



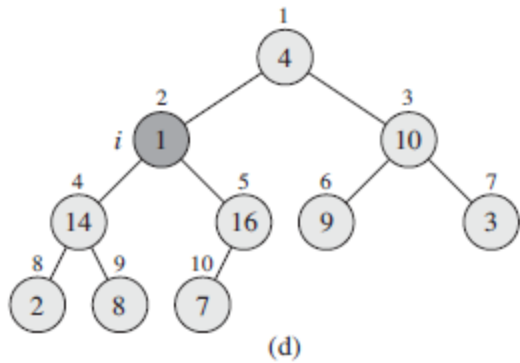
4	1	3	2	16	9	10	14	8	7
---	---	---	---	----	---	----	----	---	---



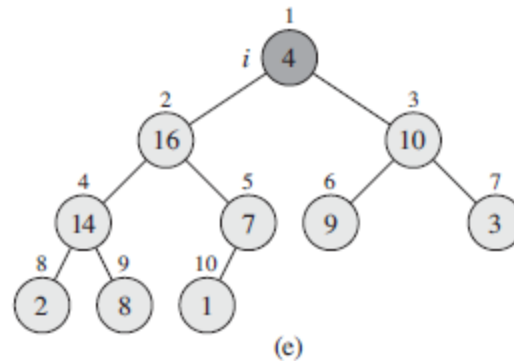
4	1	3	14	16	9	10	2	8	7
---	---	---	----	----	---	----	---	---	---



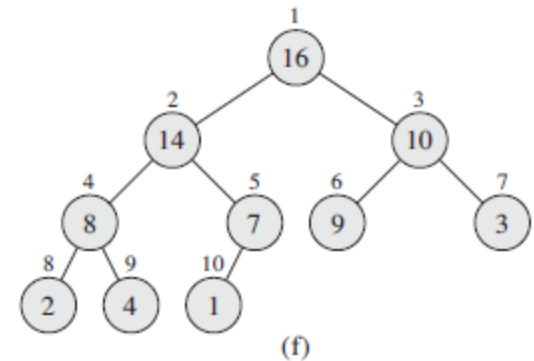
4	1	10	14	16	9	3	2	8	7
---	---	----	----	----	---	---	---	---	---



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



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



BuildHeap(): Pseudo code

```
BuildHeap(A)
{
    heap_size = n;
    for (i = n/2; i >= 1; i--)
        Heapify(A, i);
}
```


BuildHeap(): Running time

```
BuildHeap(A)
```

```
{  
    heap_size = n;  
    for (i = n/2; i >= 1; i--) ← n/2 times  
        Heapify(A, i); ← O(log n)  
}
```

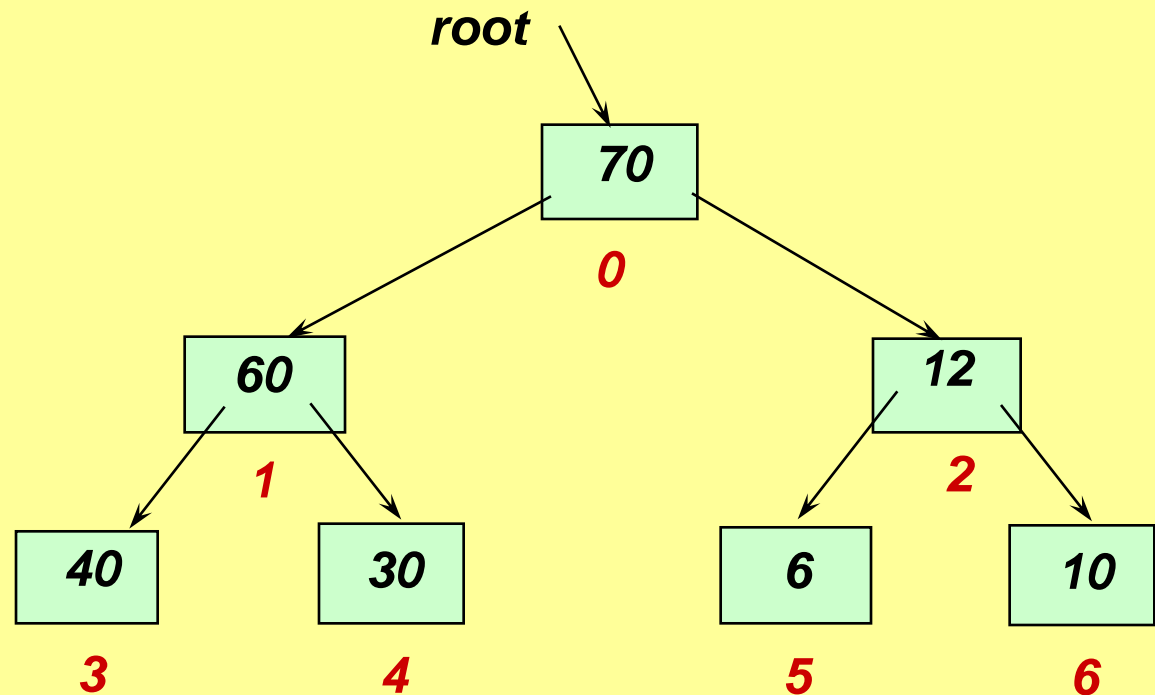
Total time: $n/2 * O(\log n) = O(n \log n)$

Heap Sort

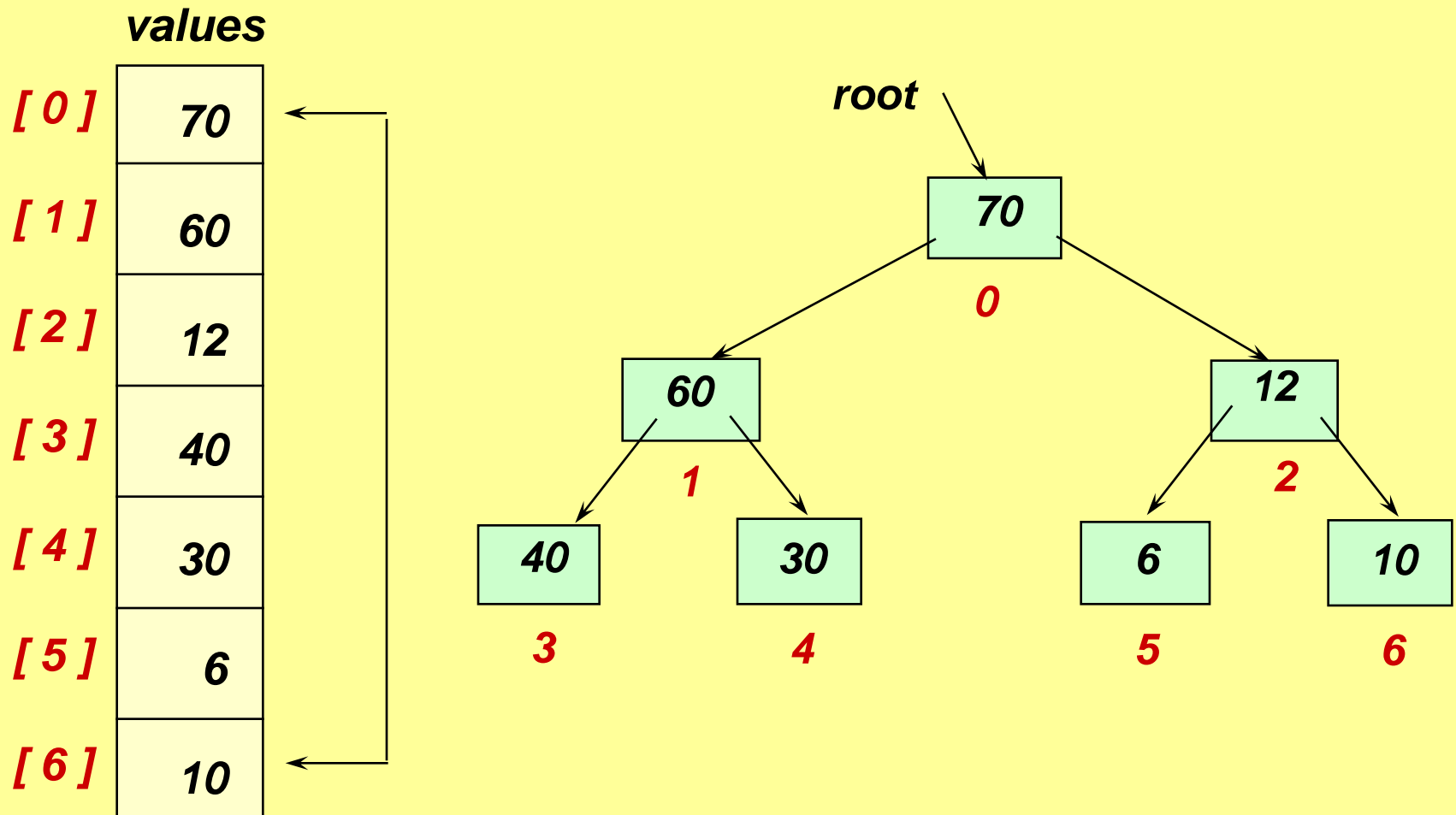
- **Step 1:** make the unsorted array into a heap by **BuildHeap()** function.
- **Step 2:** Swap the root (maximum) with the last unsorted element.
- **Step3:** Reheap by **Heapify()** function.

After BuildHeap()

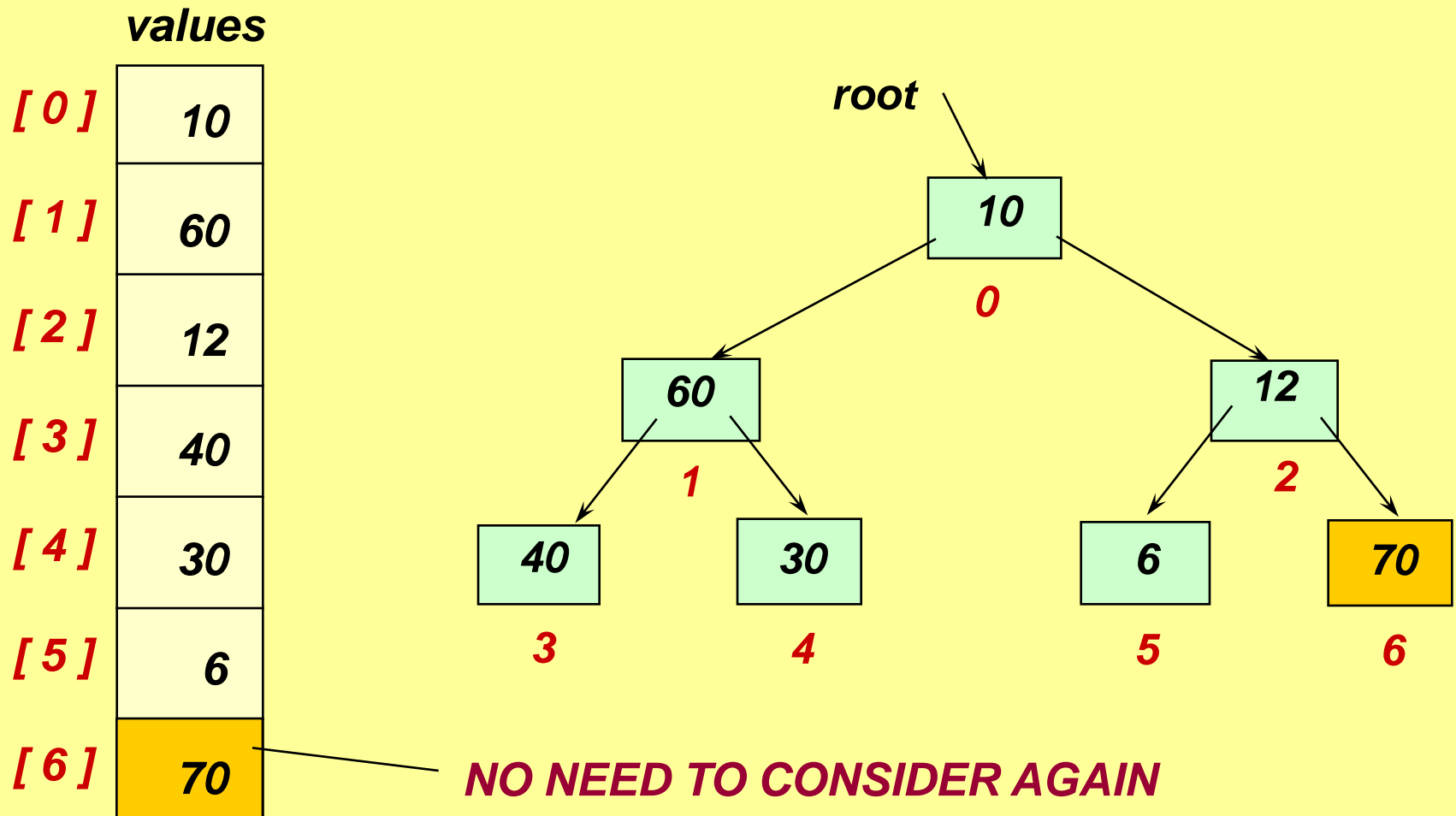
	values
[0]	70
[1]	60
[2]	12
[3]	40
[4]	30
[5]	6
[6]	10



Heap sort: Swap root element into last place in unsorted array

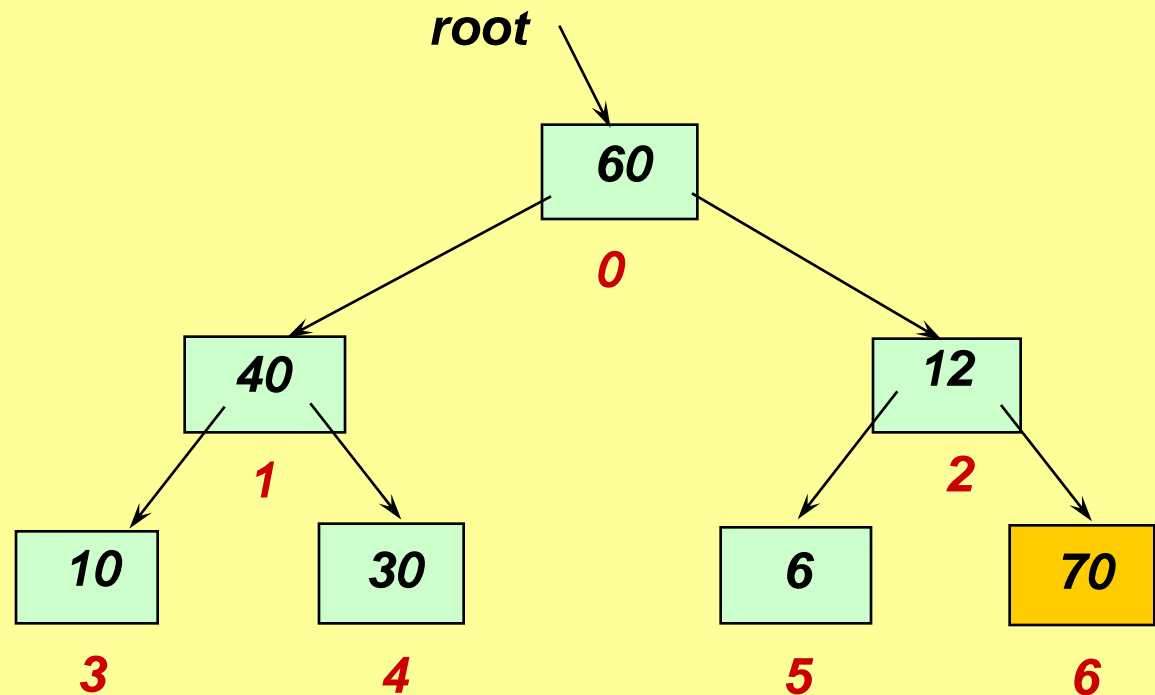


Heap sort: After swapping root element into its place

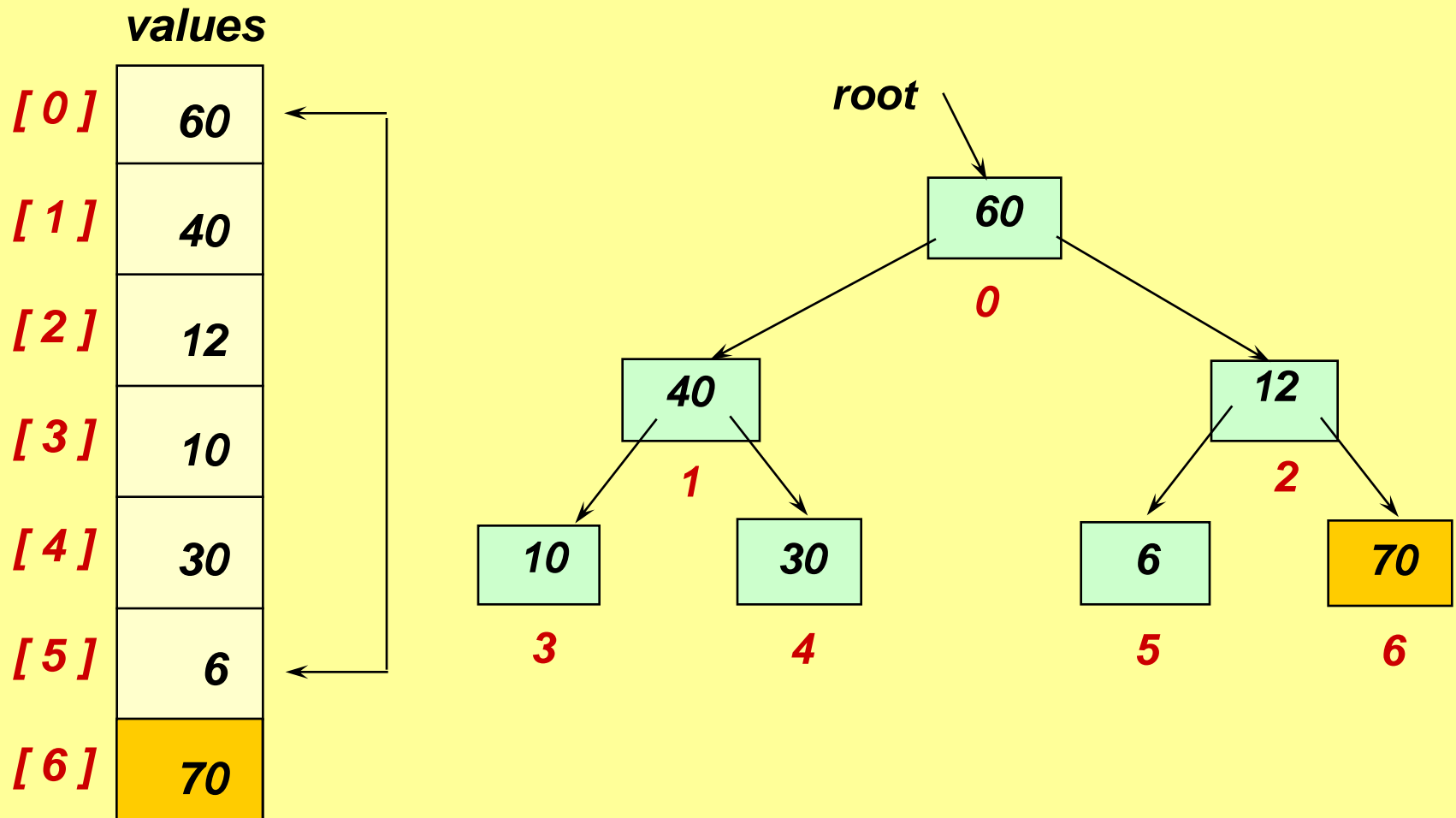


Heap sort: After reheapifying remaining unsorted elements

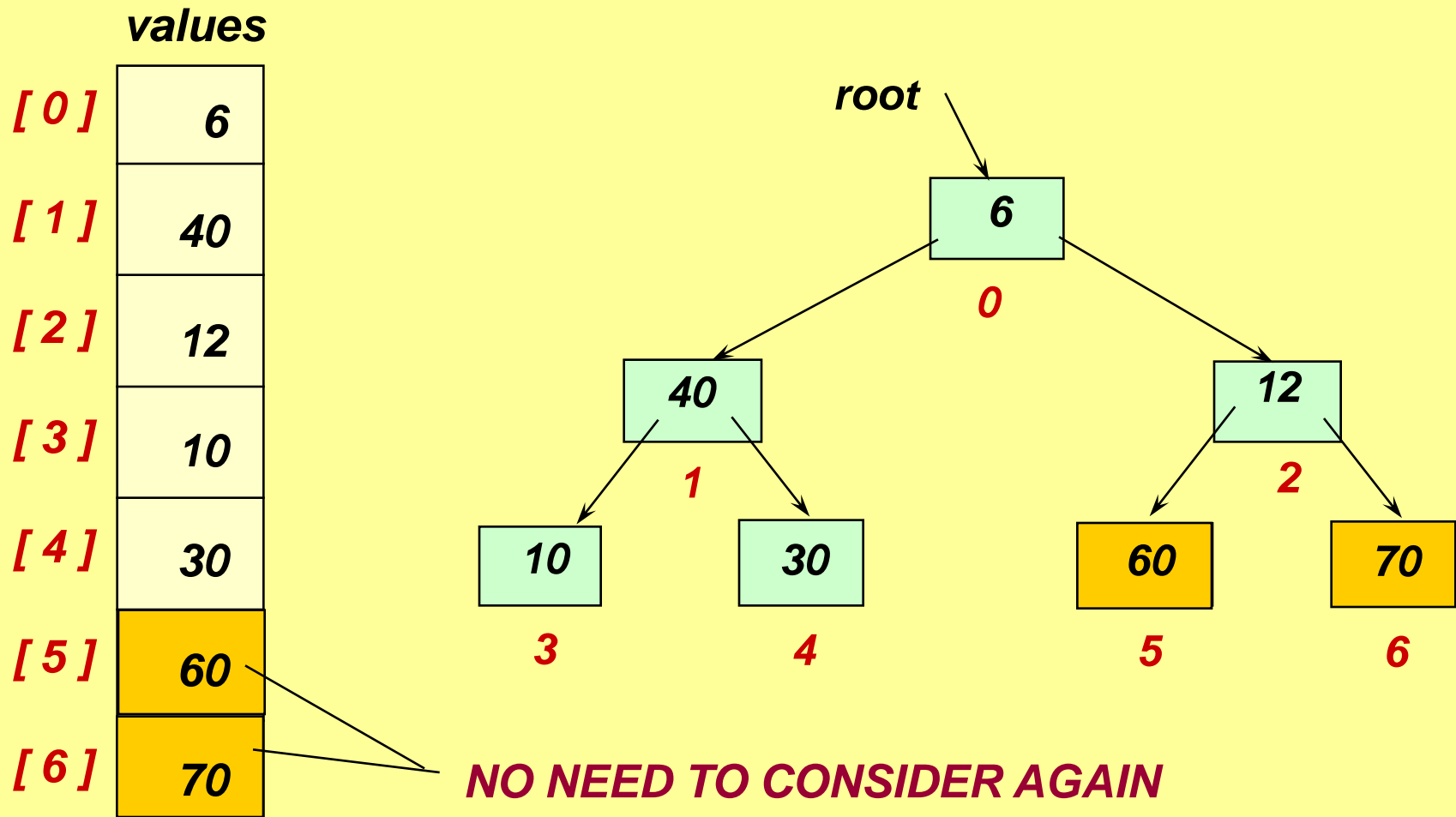
	values
[0]	60
[1]	40
[2]	12
[3]	10
[4]	30
[5]	6
[6]	70



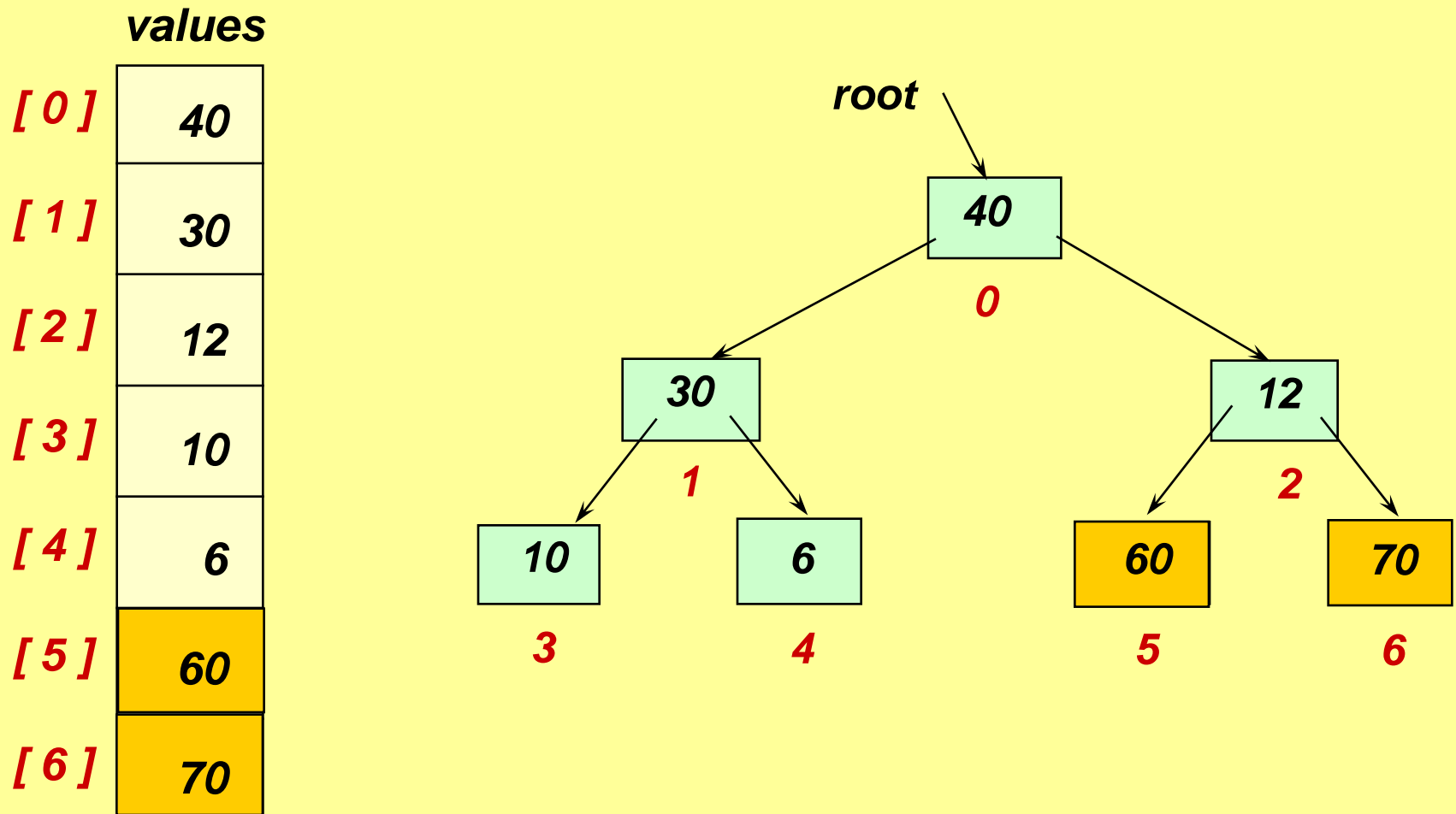
Heap sort: Swap root element into last place in unsorted array



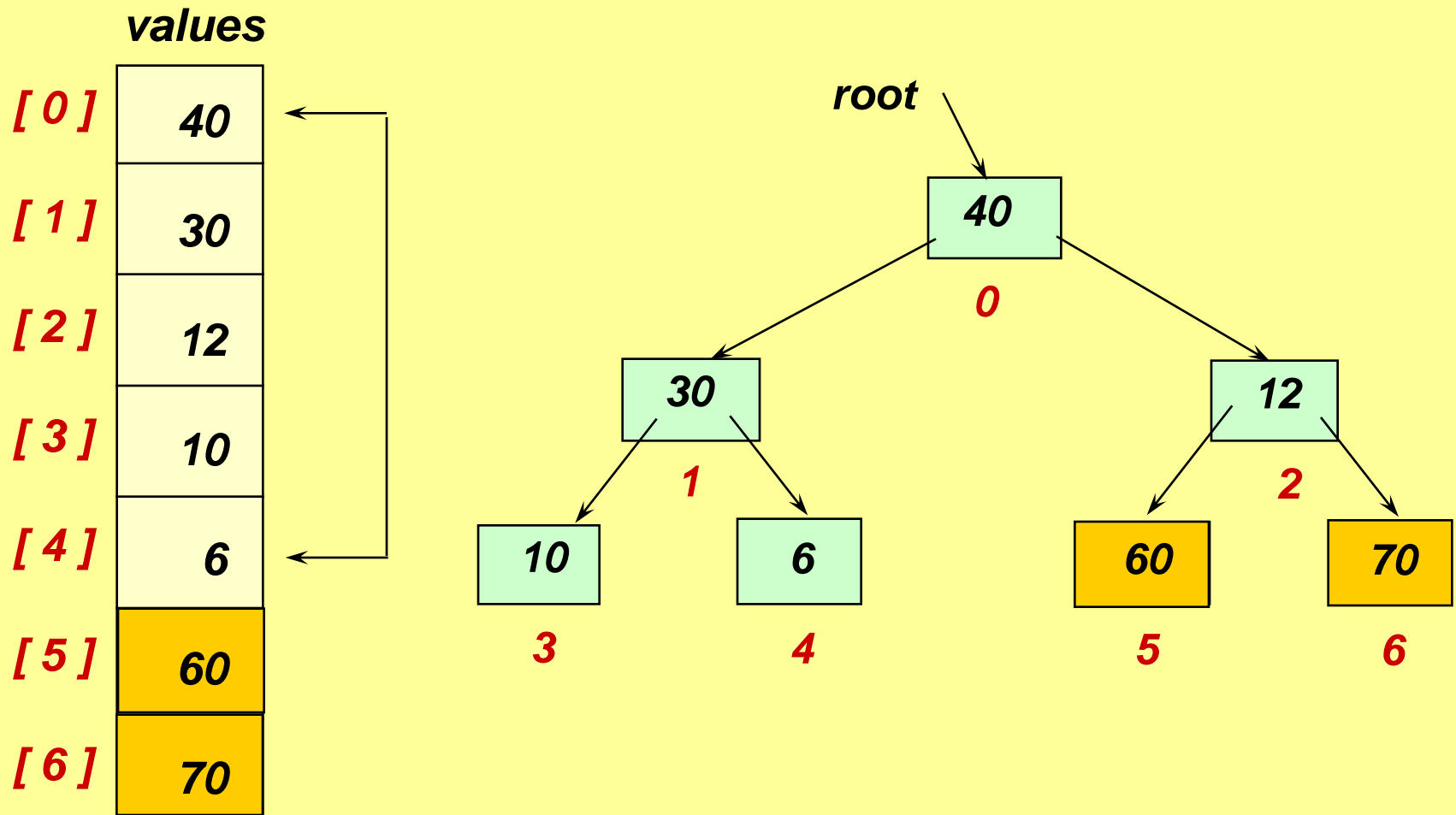
Heap sort: After swapping root element into its place



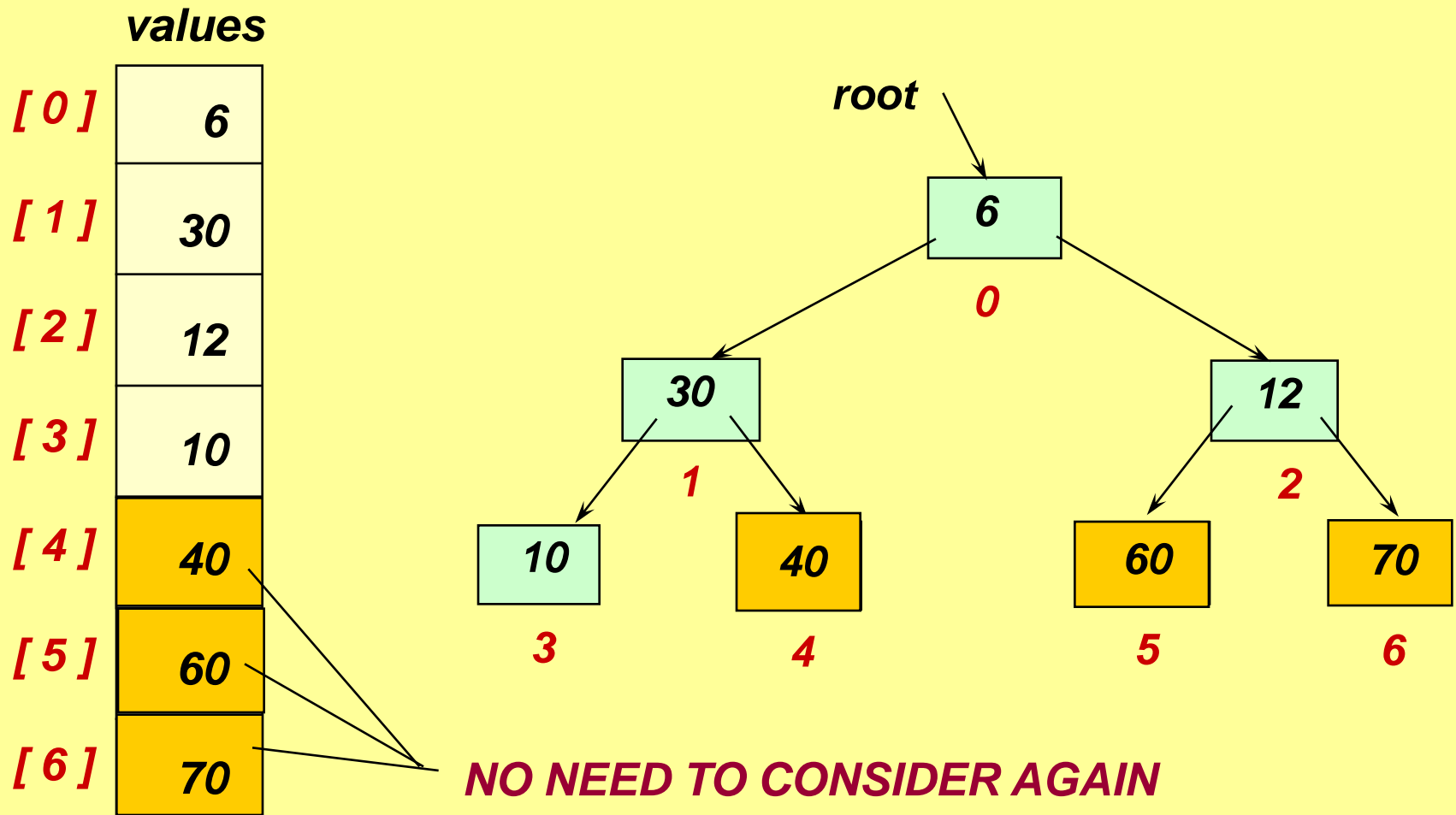
Heap sort: After reheaping remaining unsorted elements



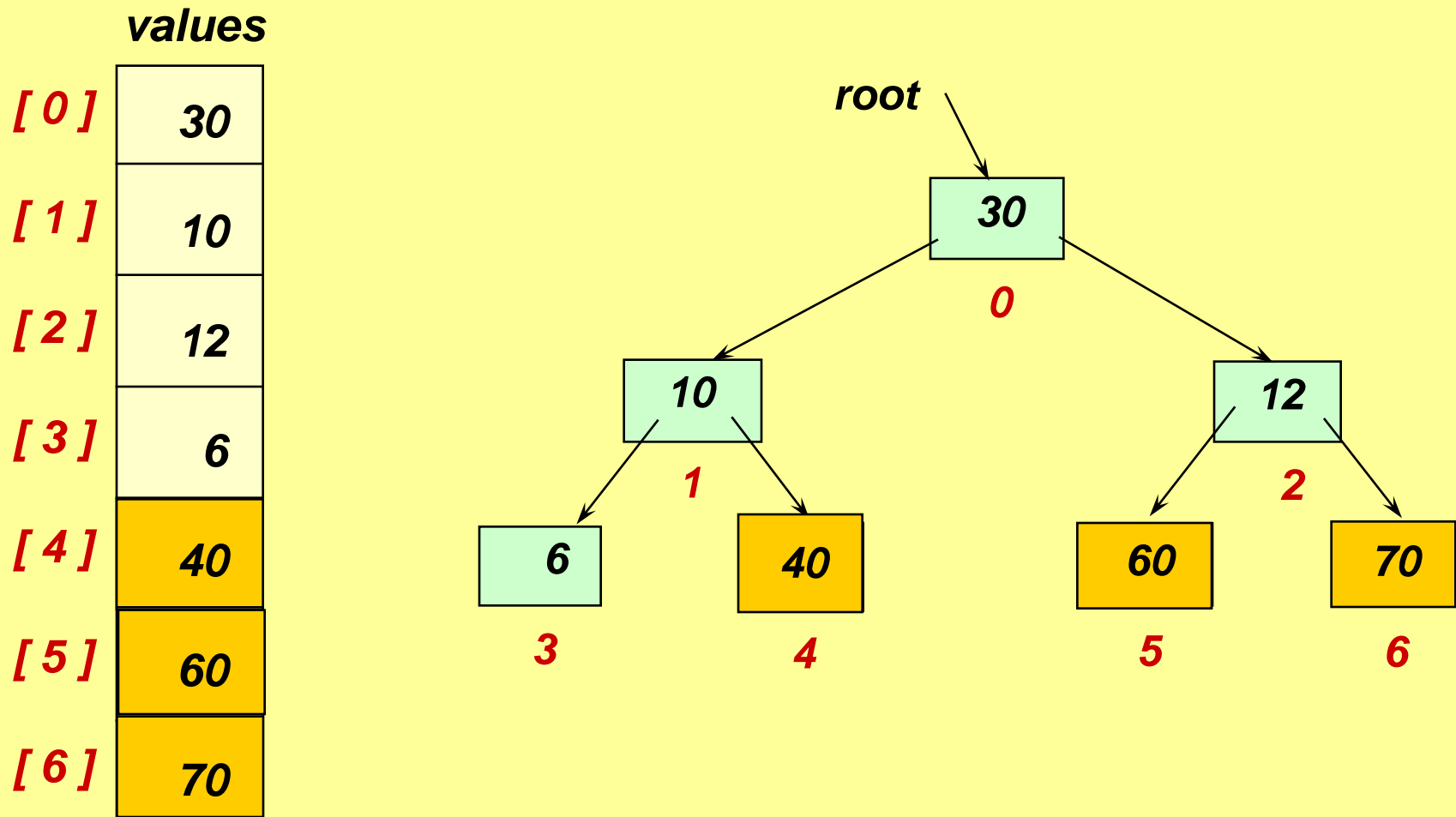
Heap sort: Swap root element into last place in unsorted array



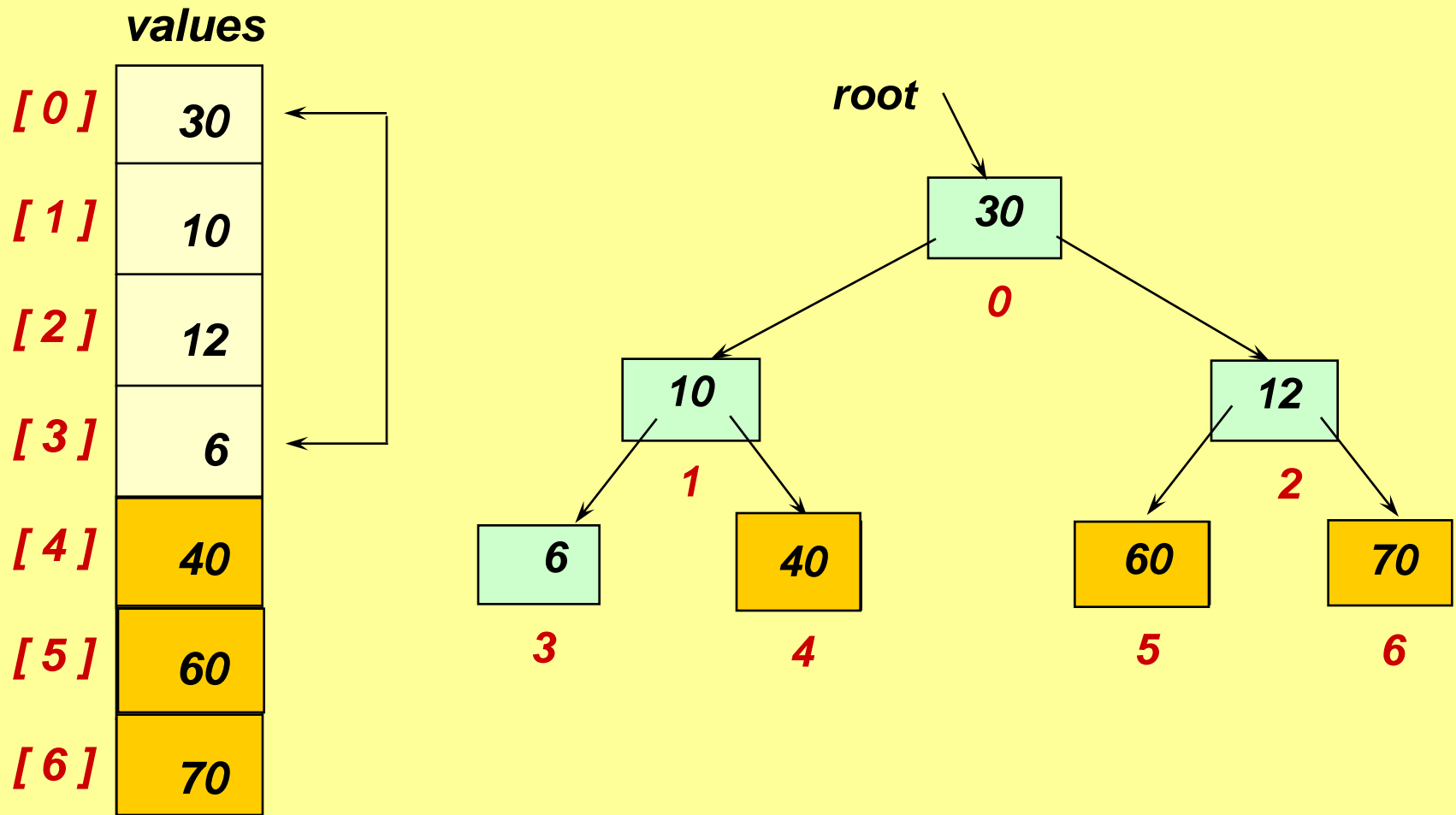
Heap sort: After swapping root element into its place



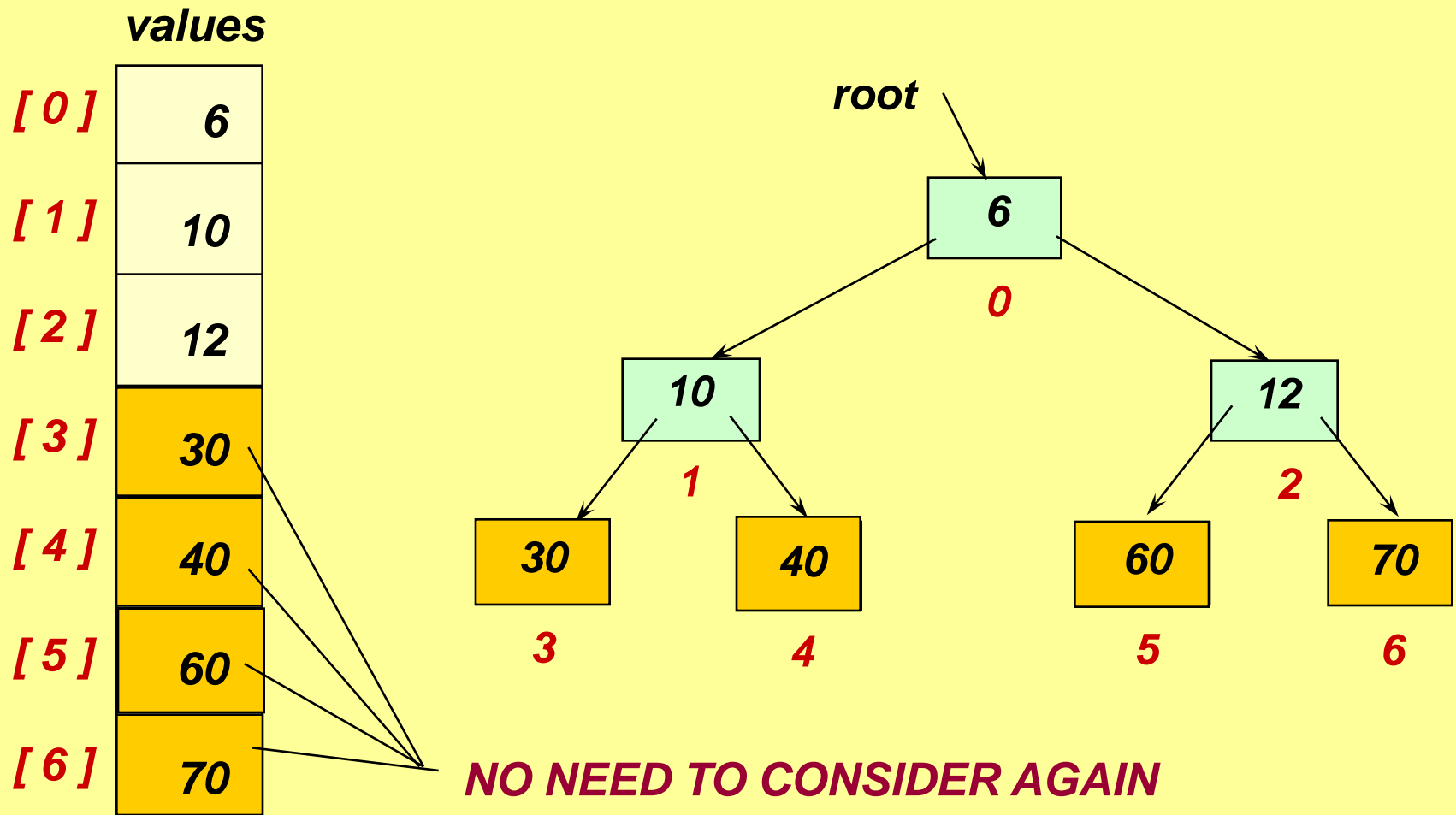
Heap sort: After reheapifying remaining unsorted elements



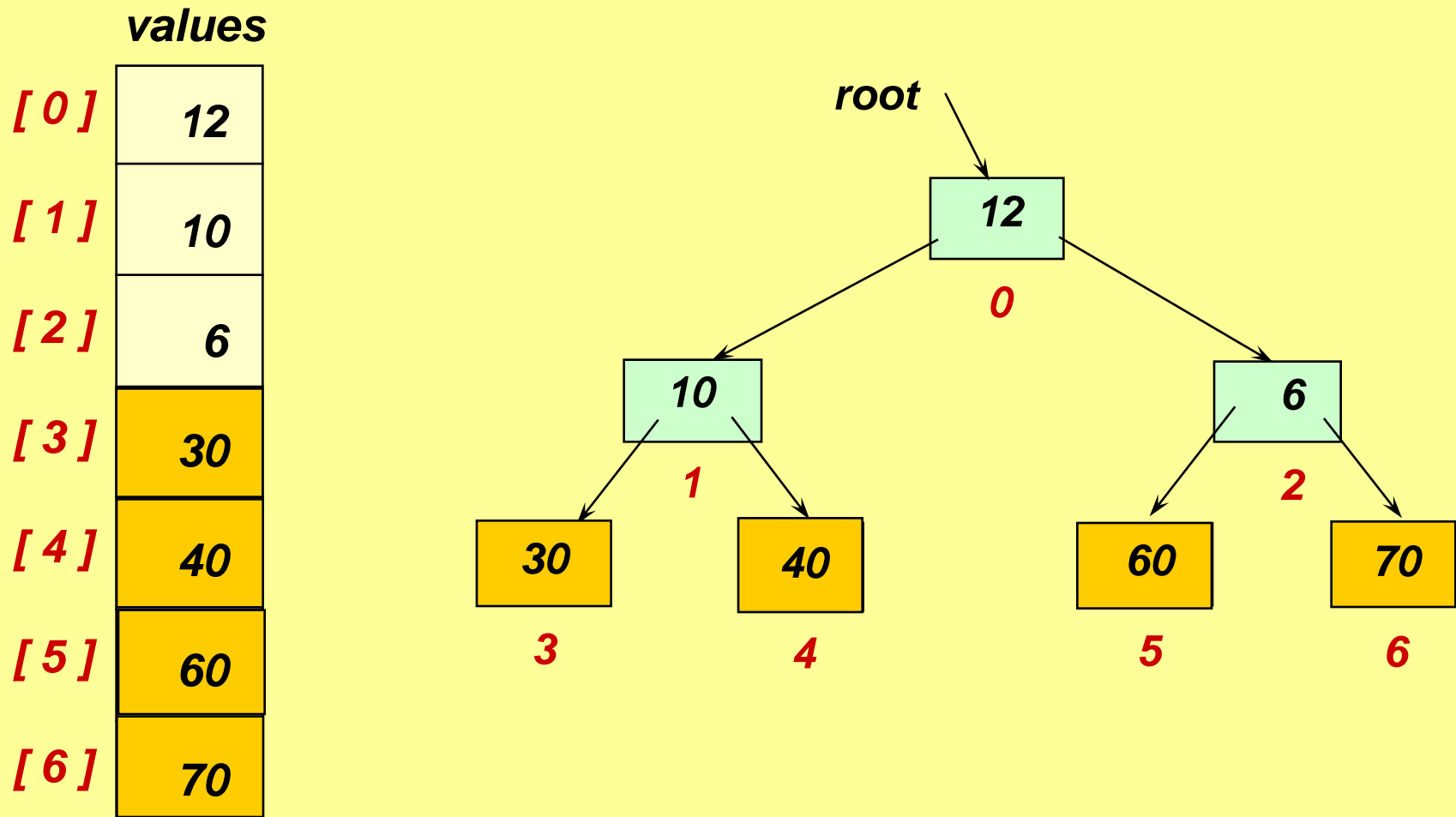
Heap sort: Swap root element into last place in unsorted array



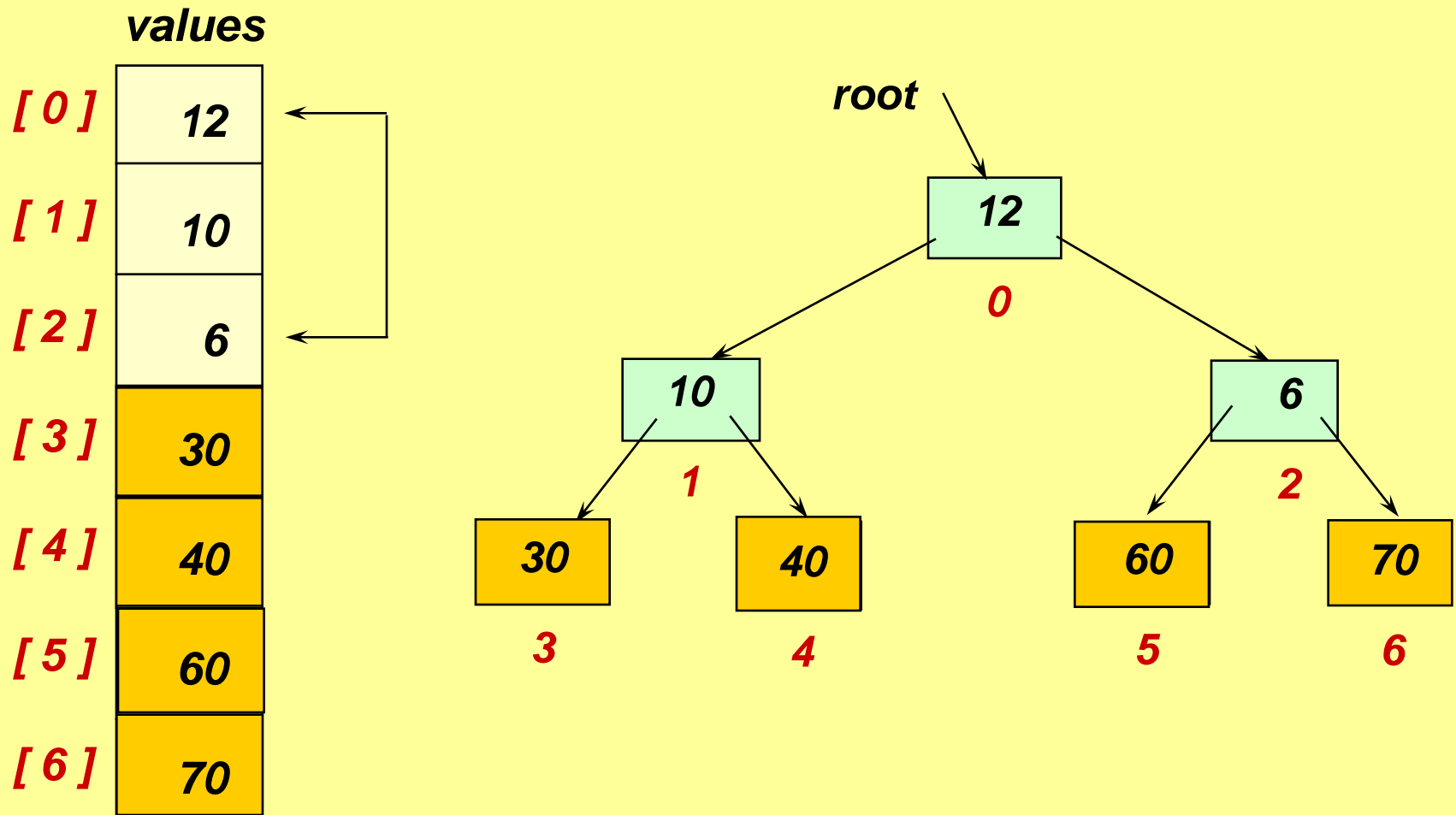
Heap sort: After swapping root element into its place



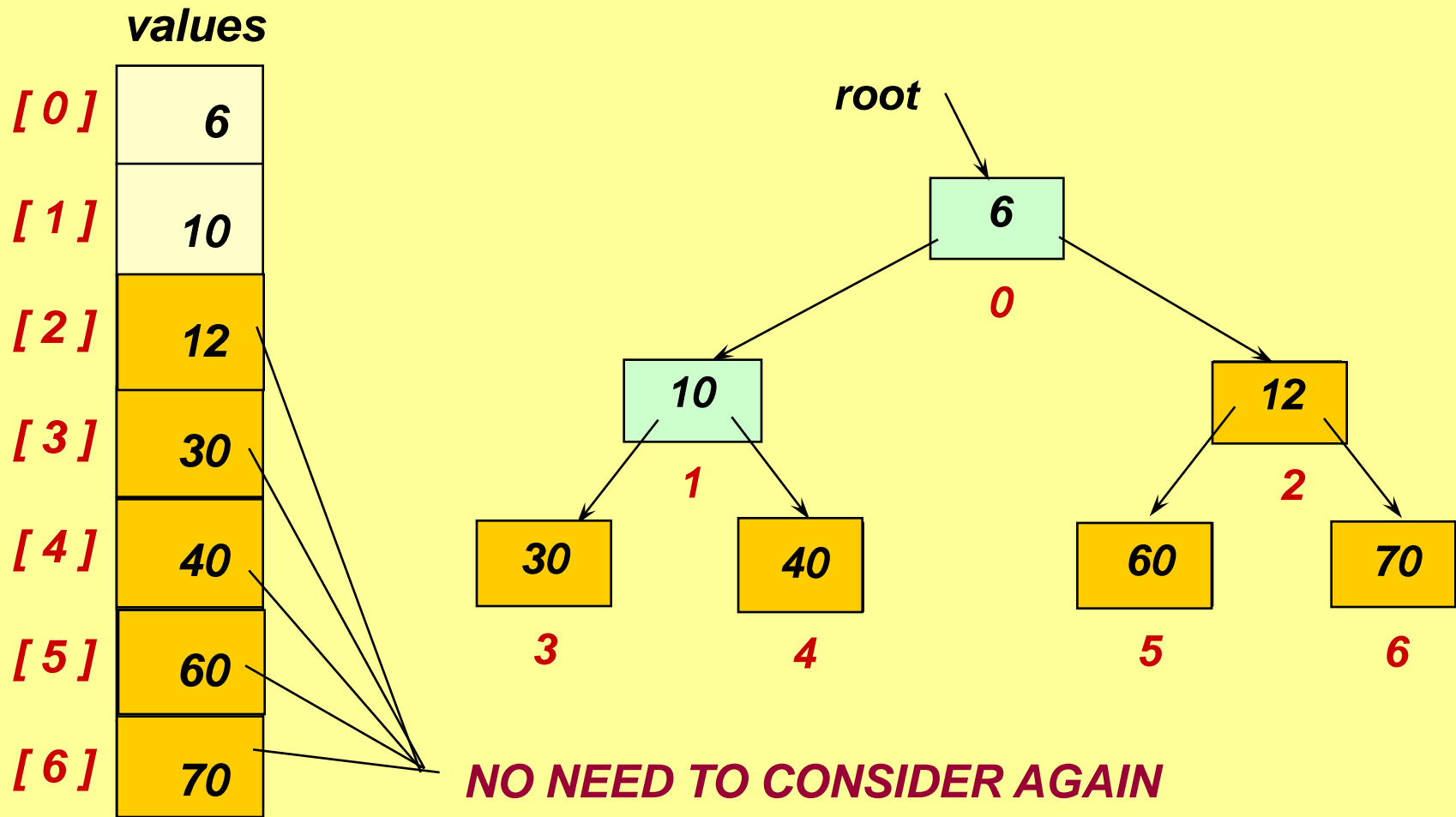
Heap sort: After reheaping remaining unsorted elements



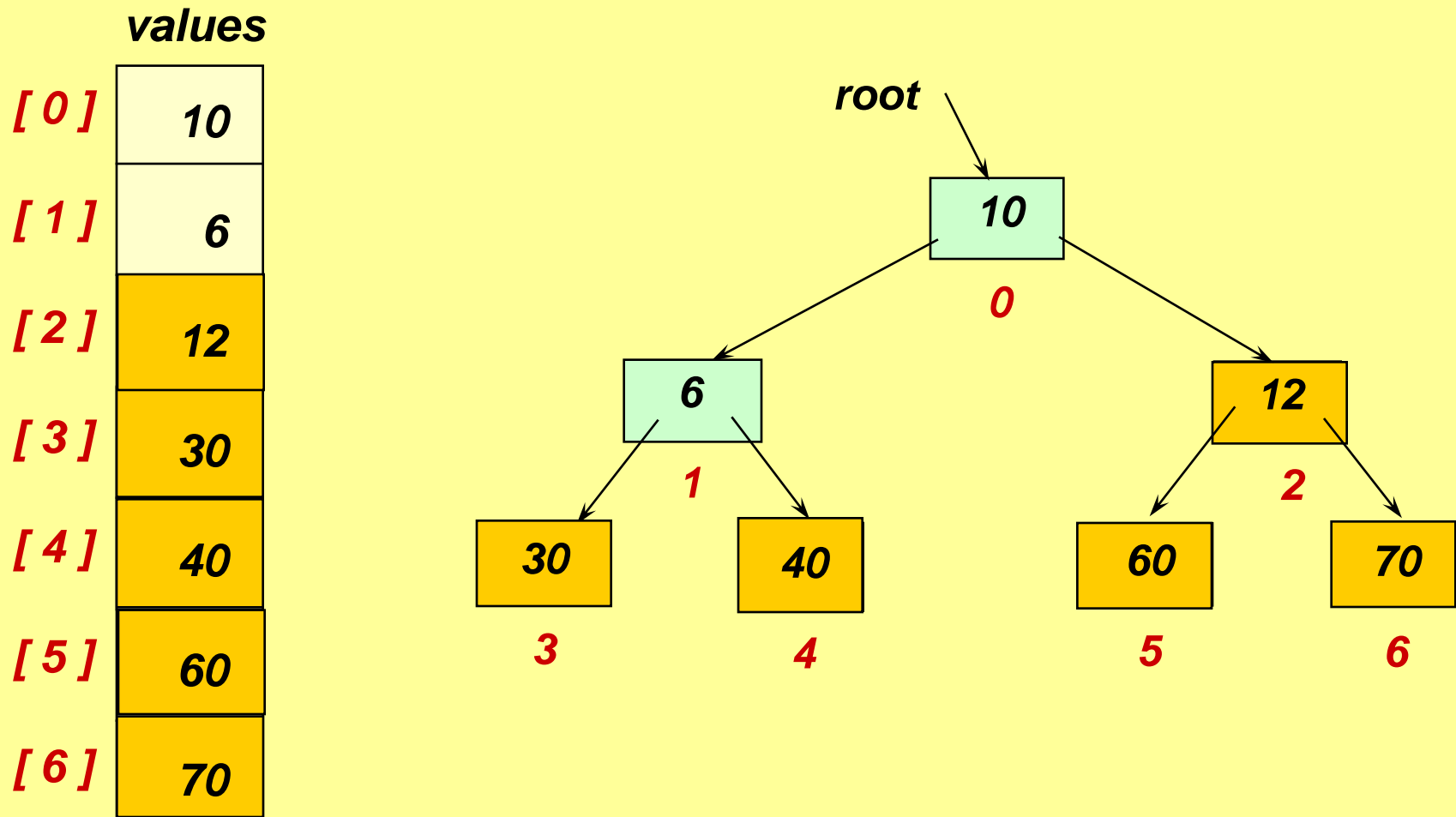
Heap sort: Swap root element into last place in unsorted array



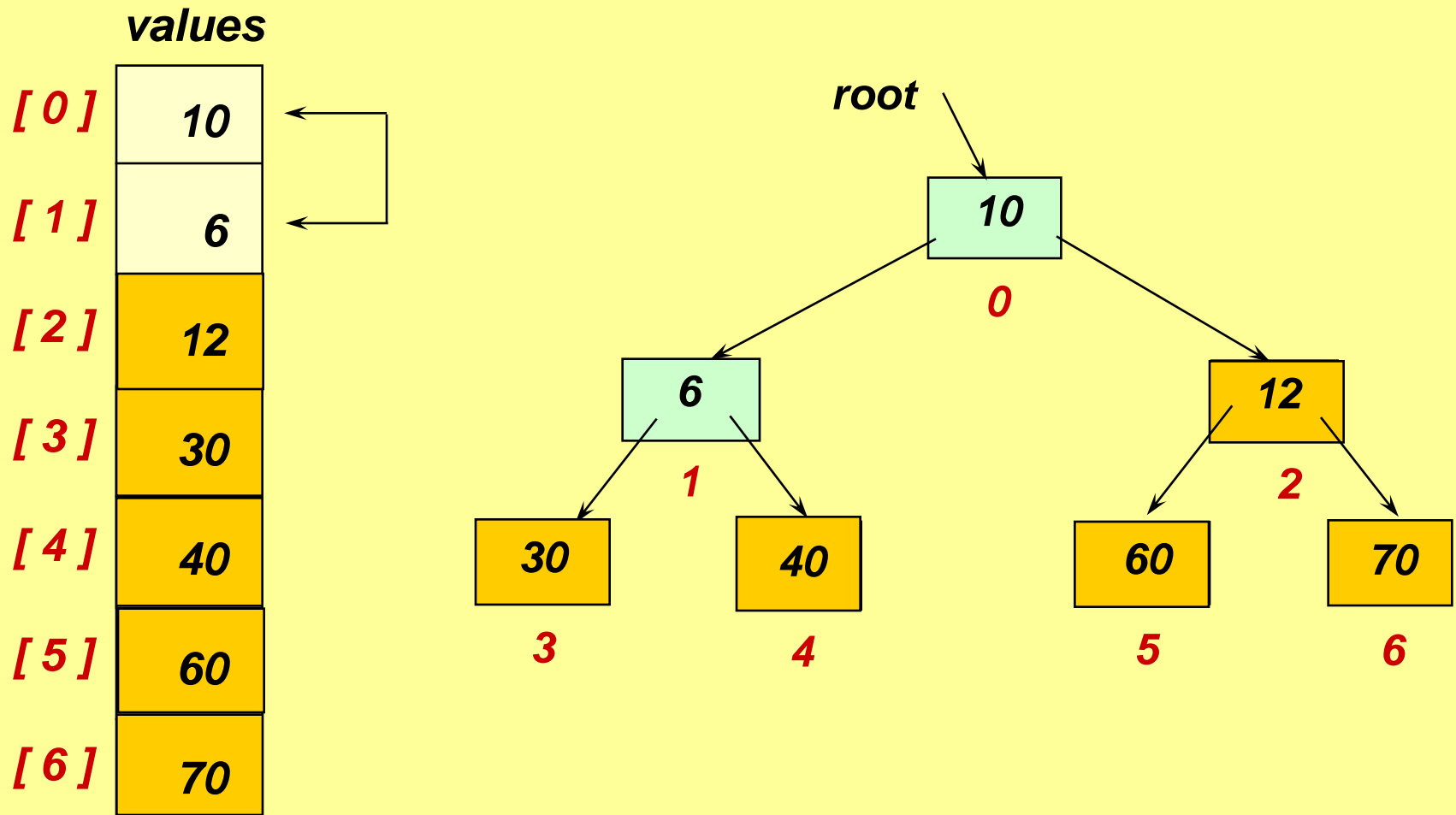
Heap sort: After swapping root element into its place



Heap sort: After reheaping remaining unsorted elements

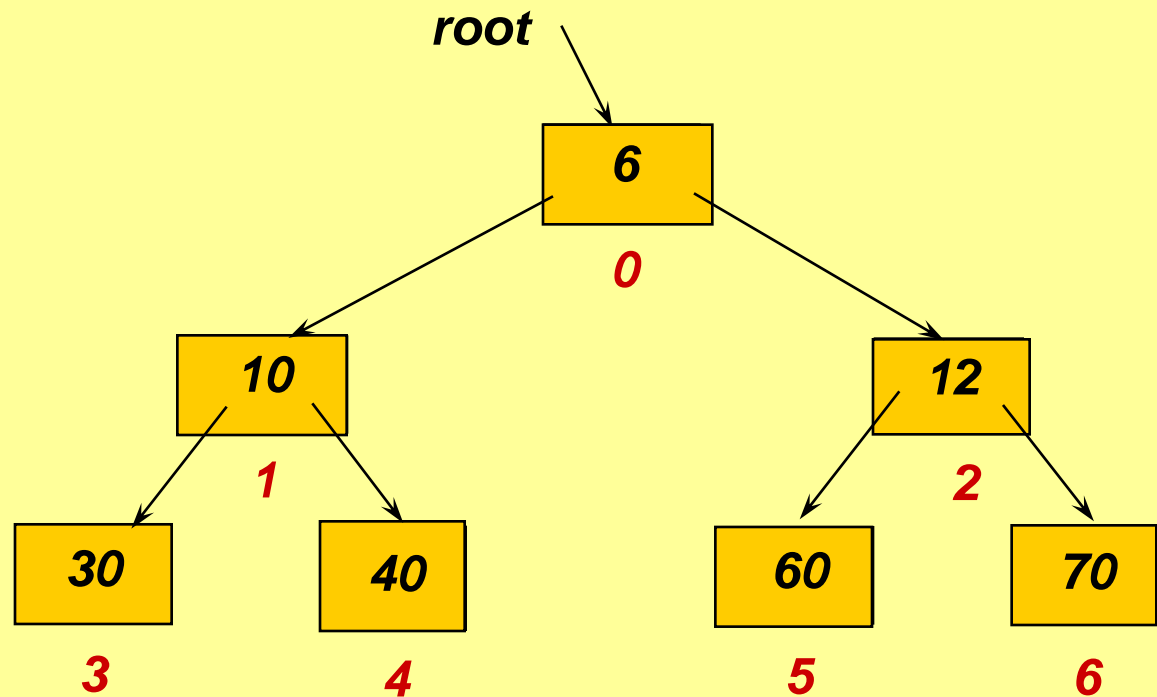


Heap sort: Swap root element into last place in unsorted array



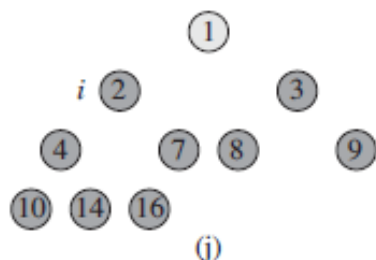
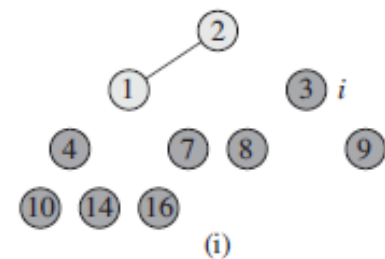
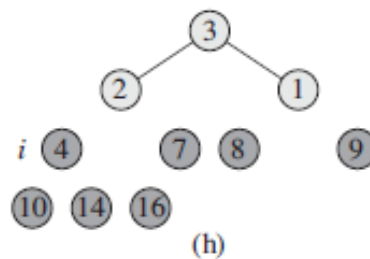
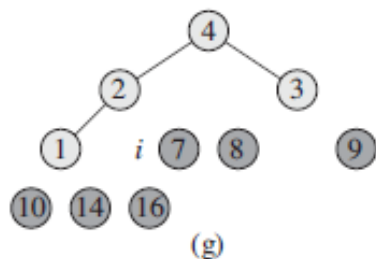
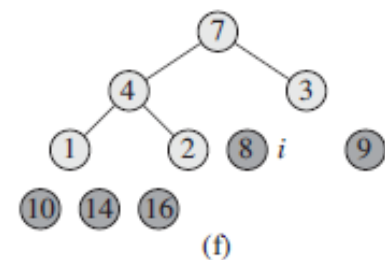
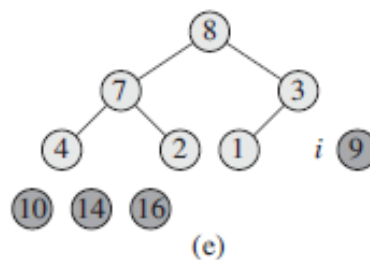
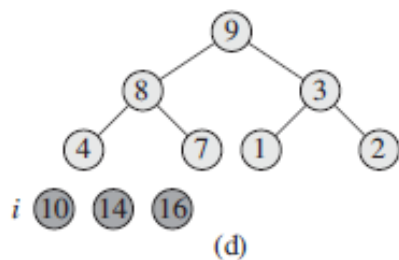
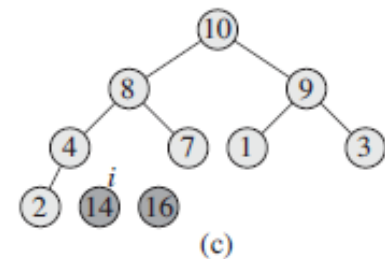
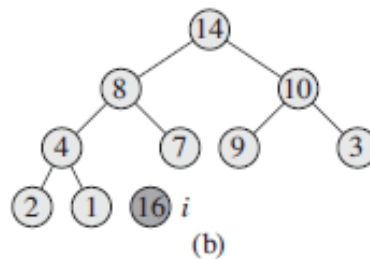
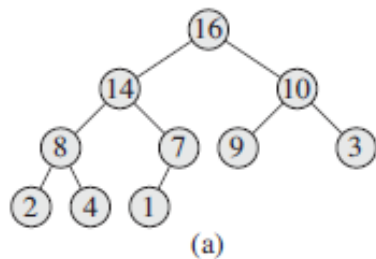
Heap sort: After swapping root element into its place

	values
[0]	6
[1]	10
[2]	12
[3]	30
[4]	40
[5]	60
[6]	70



ALL ELEMENTS ARE SORTED

Heap sort: Another example



A

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

(k)

Heapsort: Pseudo code

```
Heapsort (A)
{
    heap_size = n;
    BuildHeap (A) ;
    for (i = n; i >= 2; i--)
    {
        Swap (A[1], A[i]) ;
        heap_size -= 1;
        Heapify (A, 1) ;
    }
}
```


Heapsort: Running time

Heapsort(A)


{

 heap_size = n;

 BuildHeap(A);  $O(n \log n)$

 for (i = n; i >= 2; i--)  n-1 times

 {

 Swap(A[1], A[i]);  $O(1)$

 heap_size -= 1; 

 Heapify(A, 1);  $O(\log n)$

 }

}

Total: $O(n \log n) + (n-1) * (O(1) + O(\log n)) = O(n \log n) + O(n \log n) = O(n \log n)$

Compare with Quicksort

- Heapsort is *always* $O(n \log n)$
- Quicksort is usually $O(n \log n)$ but in the worst case slows to $O(n^2)$
- Quicksort is generally faster, but Heapsort has the guaranteed $O(n \log n)$ time and can be used in time-critical applications

Using Heaps: Priority Queues

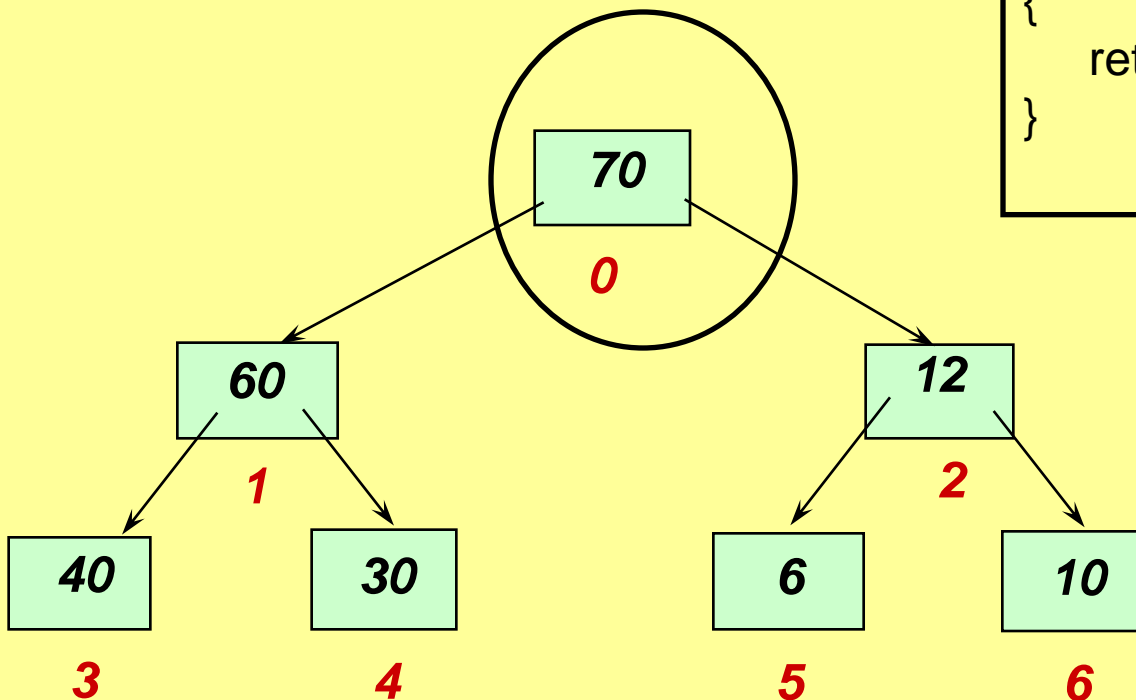
- But the heap data structure is incredibly useful for implementing *priority queues*
- Priority Queue has following operations
 - **Maximum()** returns the maximum element
 - **ExtractMax()** removes and returns the maximum element
 - **Increasekey(*i*, new_value)** change the value of position *i* to new higher value (**new_value**)
 - **Insert(x)** inserts the element x into the queue

Heap Maximum

- Return the root element
- Cost: $O(1)$

Pseudo code

```
HeapMax()  
{  
    return A[1];  
}
```

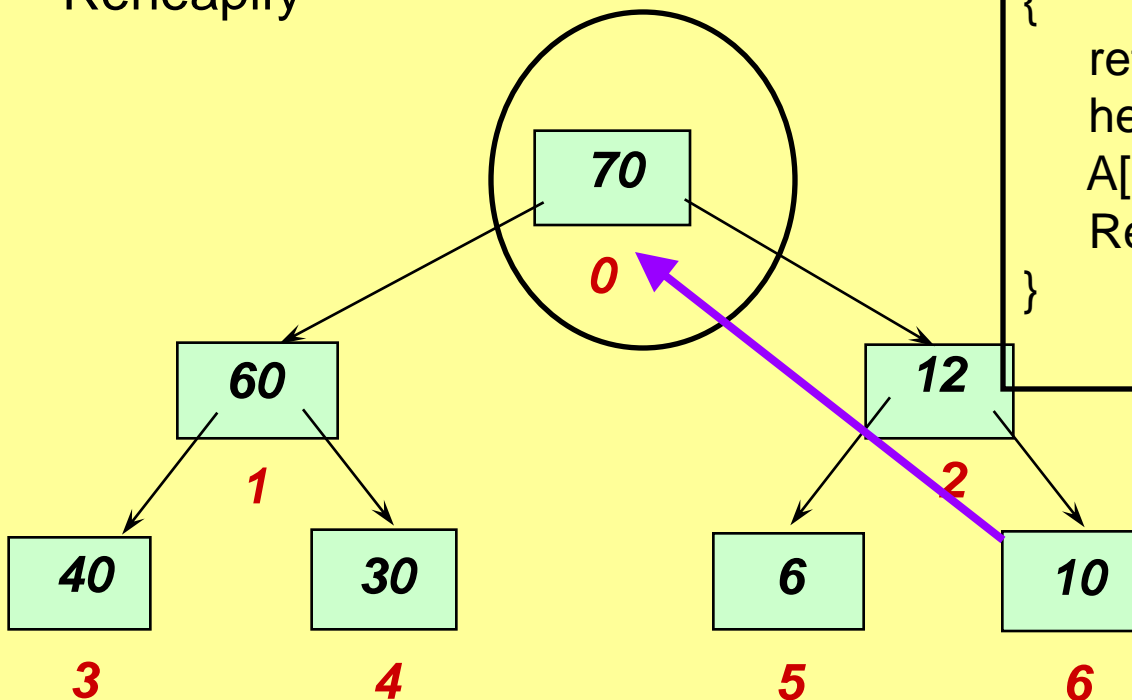


Heap Extract Maximum

- Return the root element
- Delete the root element
- Reheapify

Pseudo code

```
HeapExtractMax()  
{  
    return A[1];  
    heap_size = heap_size-1;  
    A[1] = A[heap_size];  
    Reheapify();  
}
```

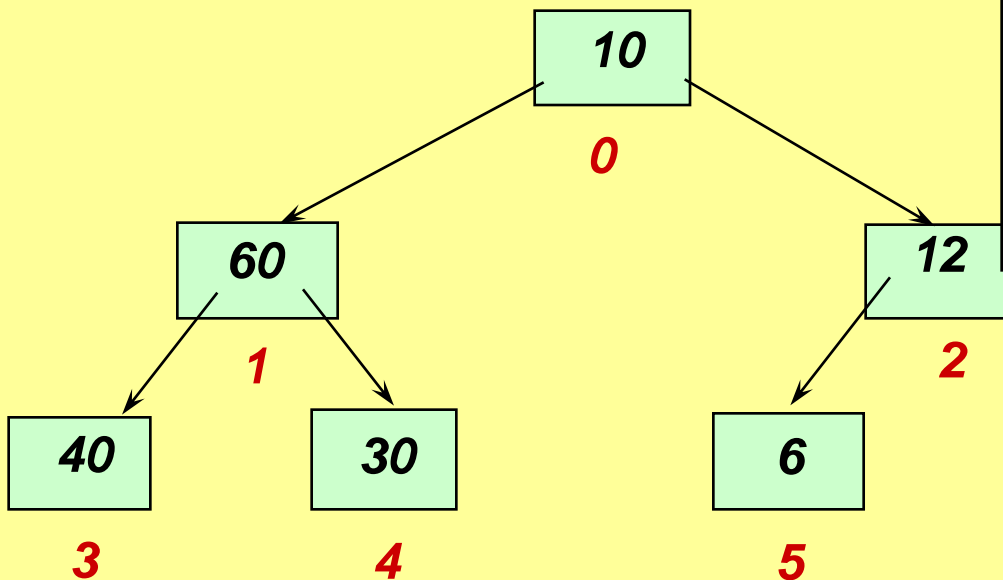


Heap Extract Maximum

- Return the root element
- Delete the root element
- Reheapify

Pseudo code

```
HeapExtractMax()
{
    return A[1];
    heap_size = heap_size-1;
    A[1] = A[heap_size];
    Reheapify();
}
```

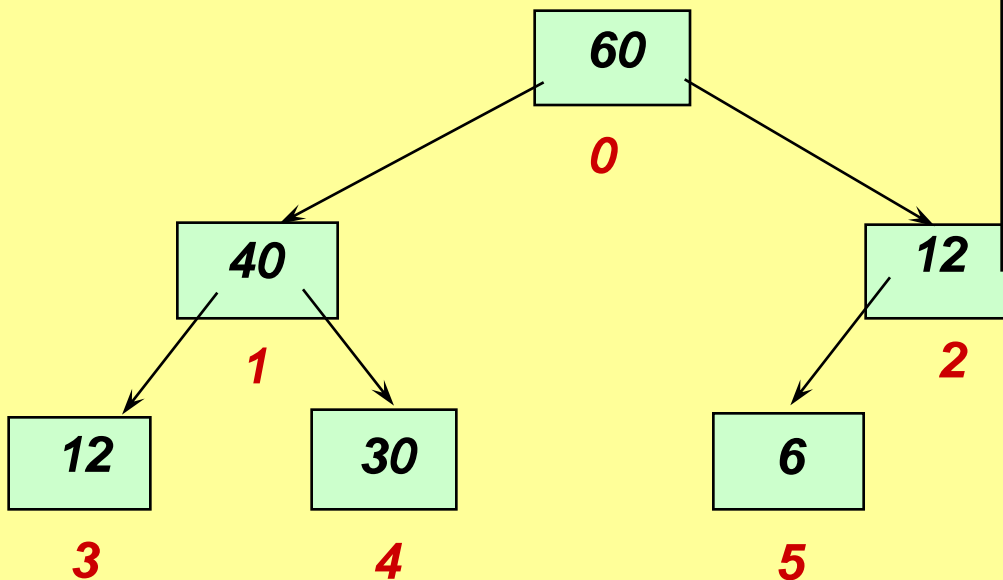


Heap Extract Maximum

- Return the root element
- Delete the root element
- Reheapify

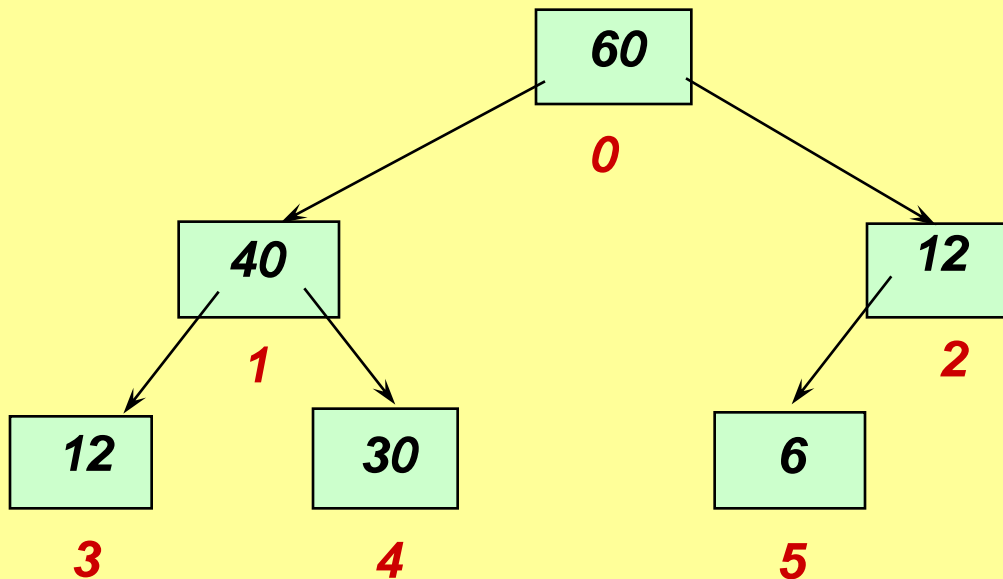
Pseudo code

```
HeapExtractMax()
{
    return A[1];
    heap_size = heap_size-1;
    A[1] = A[heap_size];
    Reheapify();
}
```



Heap **Extract**Maximum

- Return the root element
- Delete the root element
- Reheapify



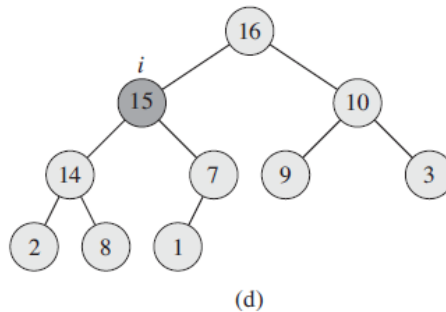
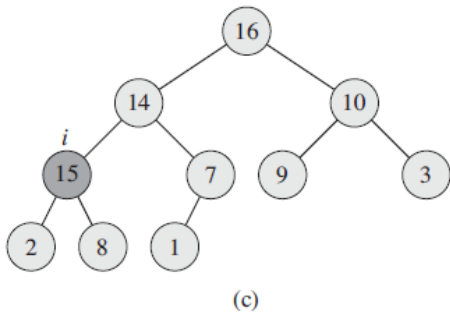
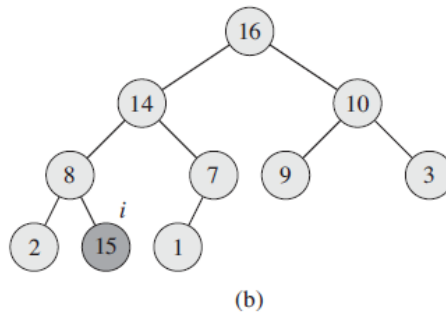
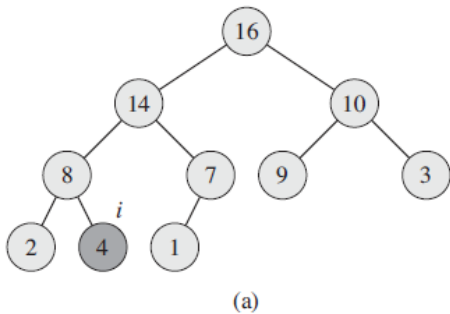
Pseudo code

```
HeapExtractMax()
{
    return A[1];
    heap_size = heap_size-1;
    A[1] = A[heap_size];
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}
```

• Cost: $O(1) + O(1) + O(1) + O(\log n) = O(\log n)$

Priority Queue Operations: IncreaseKey

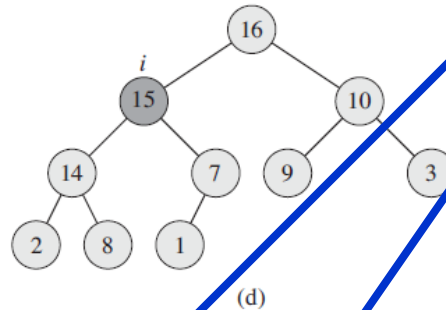
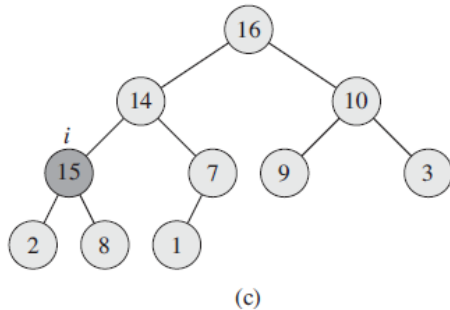
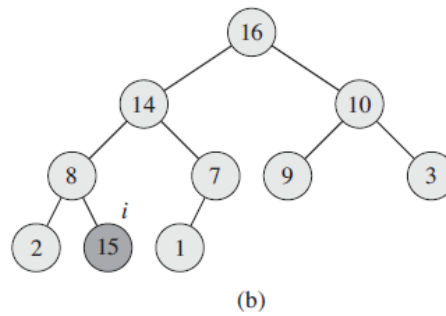
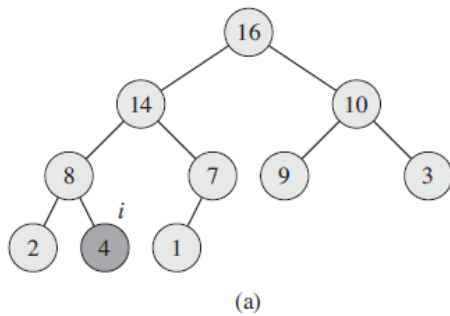
- Increase a value to **new_value**
- do swapping as long as necessary to maintain the heap property



Pseudo code

```
IncreaseKey(i, new_value)
{
    A[i] = new_value;
    while (i > 1 and A[parent(i)] < A[i])
        swap(A[parent(i)], A[i]);
    i = parent(i);
}
```

Priority Queue Operations: IncreaseKey



Pseudo code

```
IncreaseKey(i, new_value)
```

```
{
```

```
  A[i] = new_value;
```

```
  while (i > 1 and A[parent(i)] < A[i])
```

```
    swap(A[parent(i)], A[i]);
```

```
    i = parent(i);
```

```
}
```

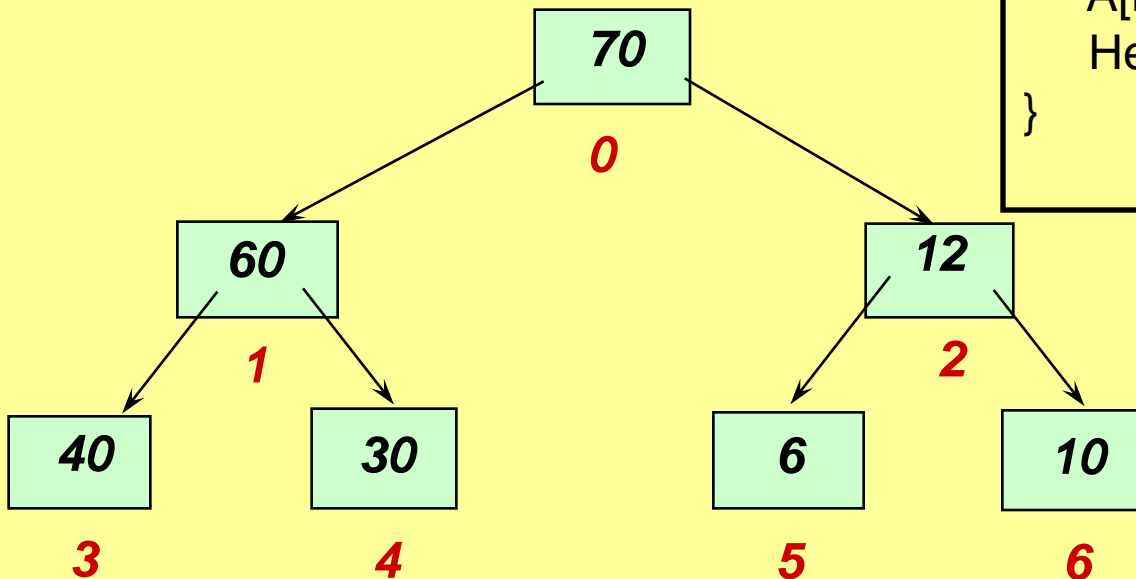
- Cost: $O(1) + \text{height} * (O(1) + O(1)) = O(\log n) * O(1) = O(\log n)$

Heap Insert

- Insert a node with $-\infty$ at the end
- then, increase the node to x by `HeapIncrease()`
- `HeapIncrease()` will do the necessary heapify

Pseudo code

```
HeapInsert(x)
{
    heap_size = heap_size+1;
    A[heap_size] = x;
    HeapIncrease(heap_size,x);
}
```

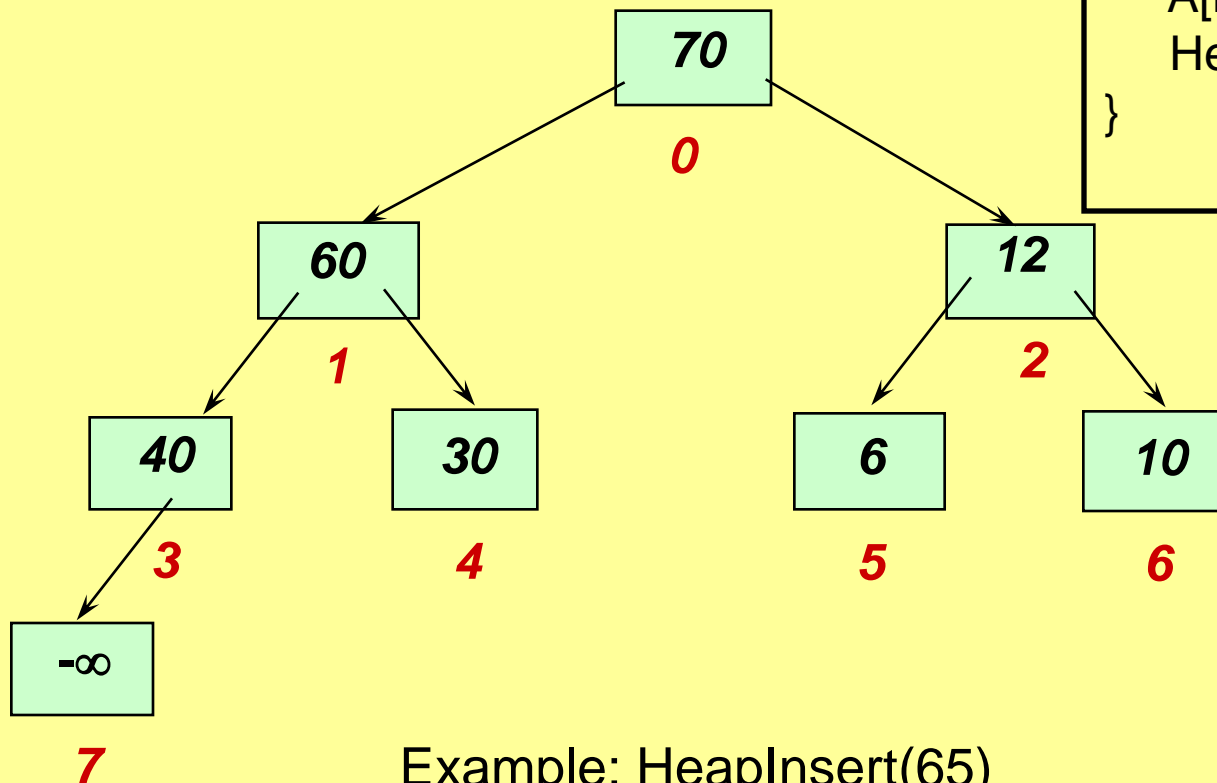


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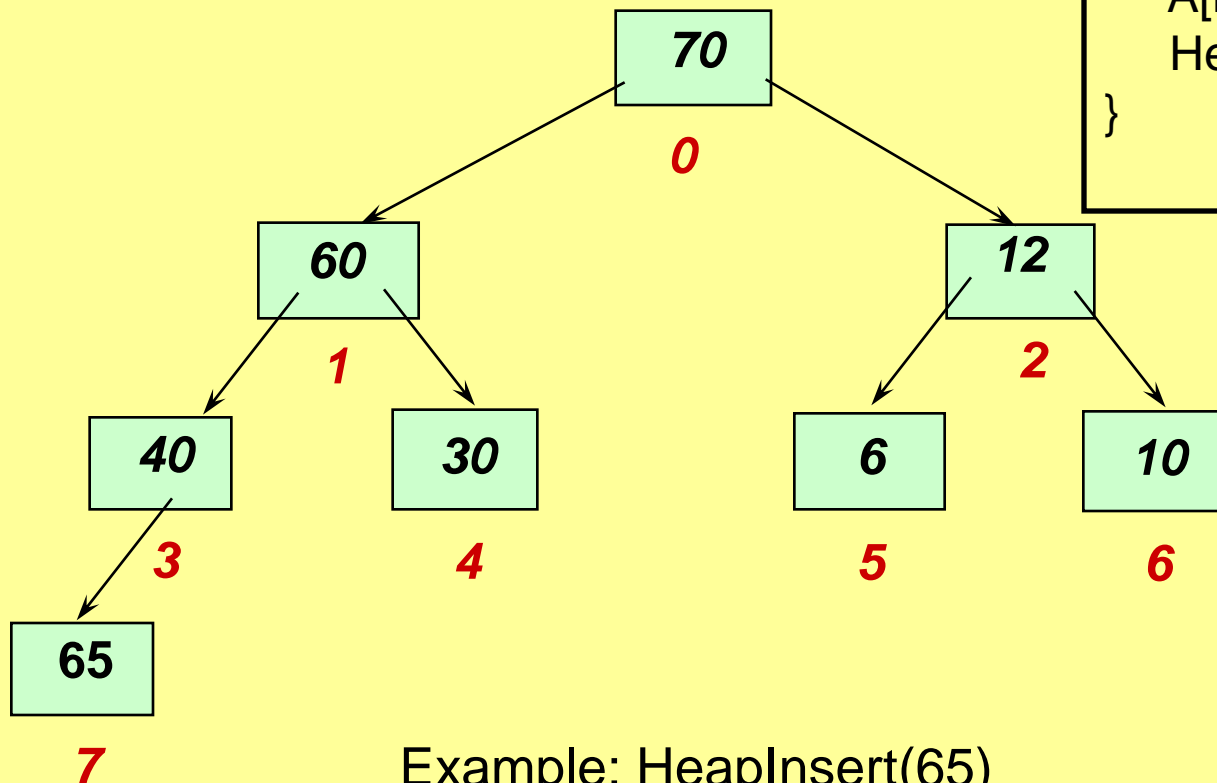
Example: `HeapInsert(65)`

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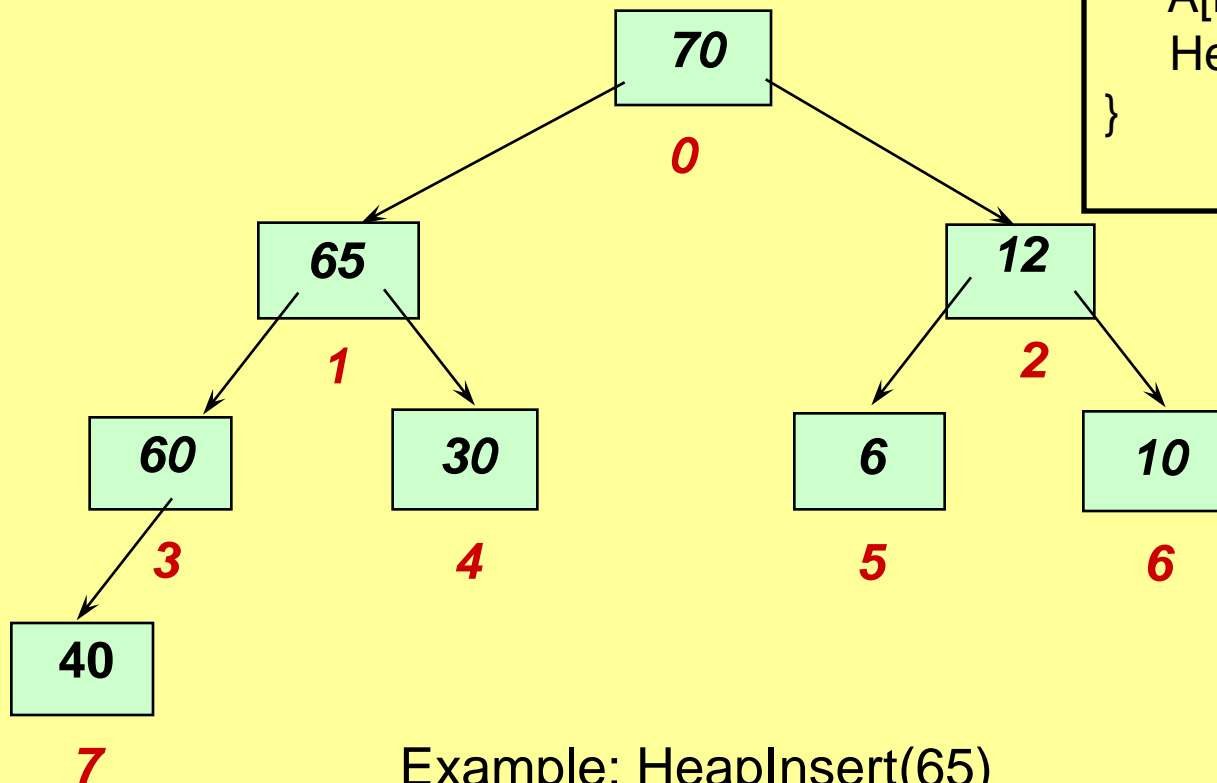
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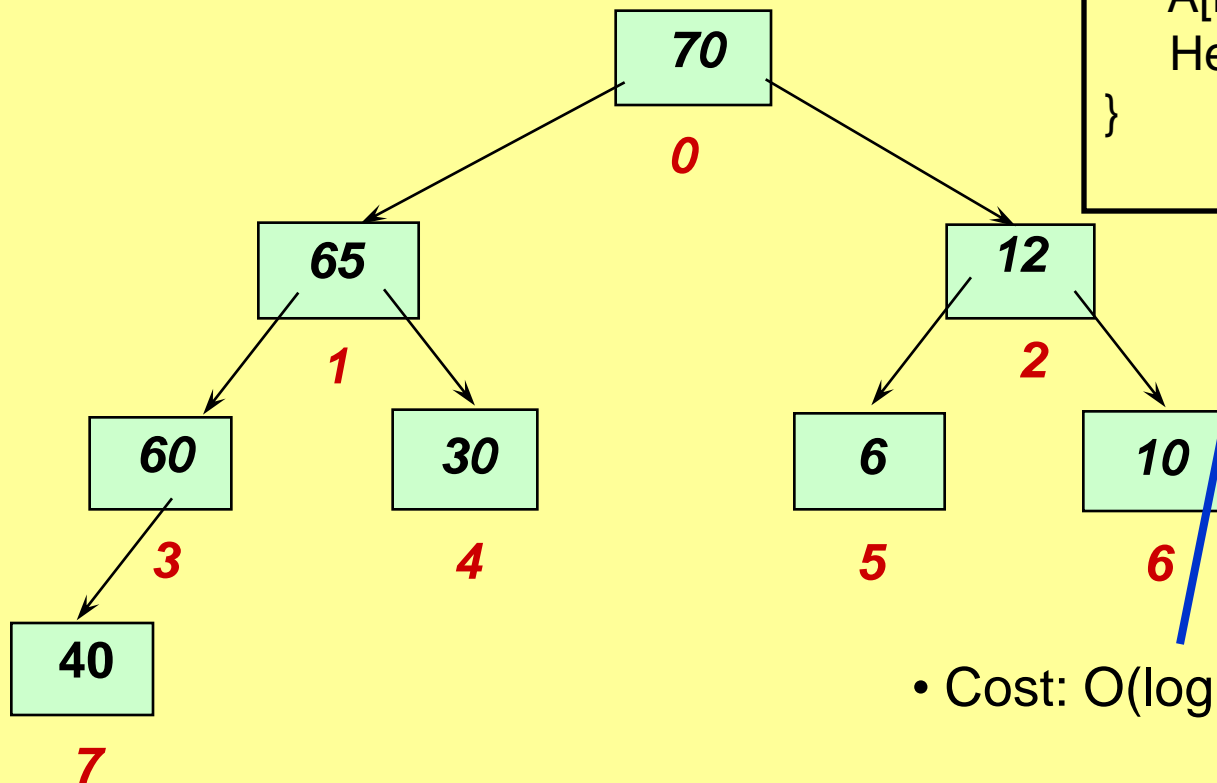
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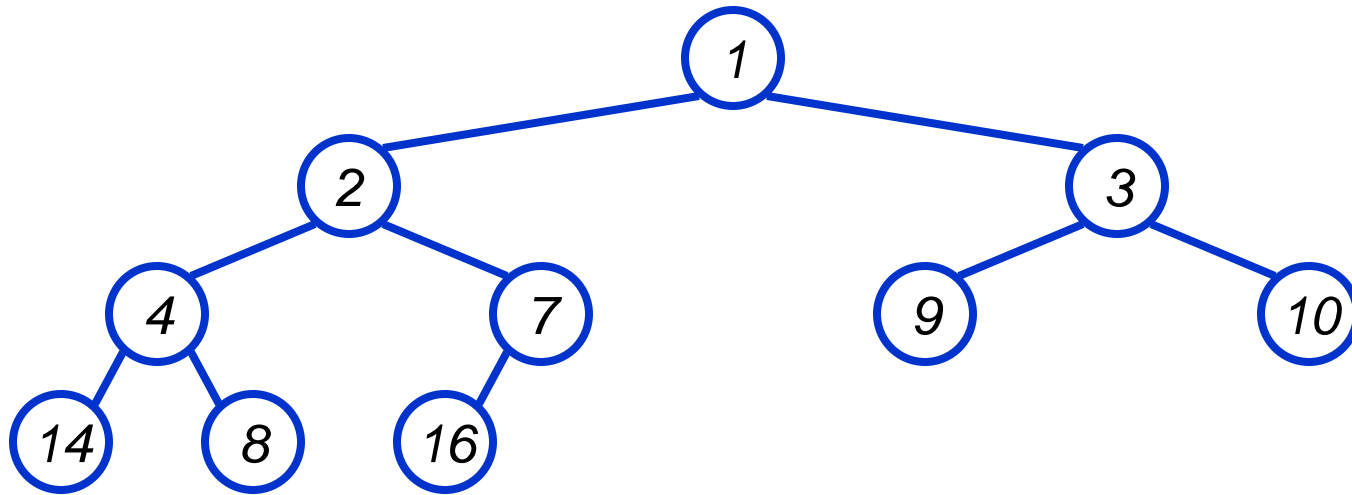
```
HeapInsert(x)
{
    heap_size = heap_size + 1;
    A[heap_size] = x;
    HeapIncrease(heap_size, x);
}
```



- Cost: $O(\log n) + O(1) + O(1) = O(\log n)$

Min Heap

- ***Parent*** \leq ***left, right*** for all nodes
- All operations similar to Max Heap: Heapify(), BuildHeap(), HeapSort(), HeapMin(), HeapInsert(), HeapExtractMin(), DecreaseKey().



A =

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