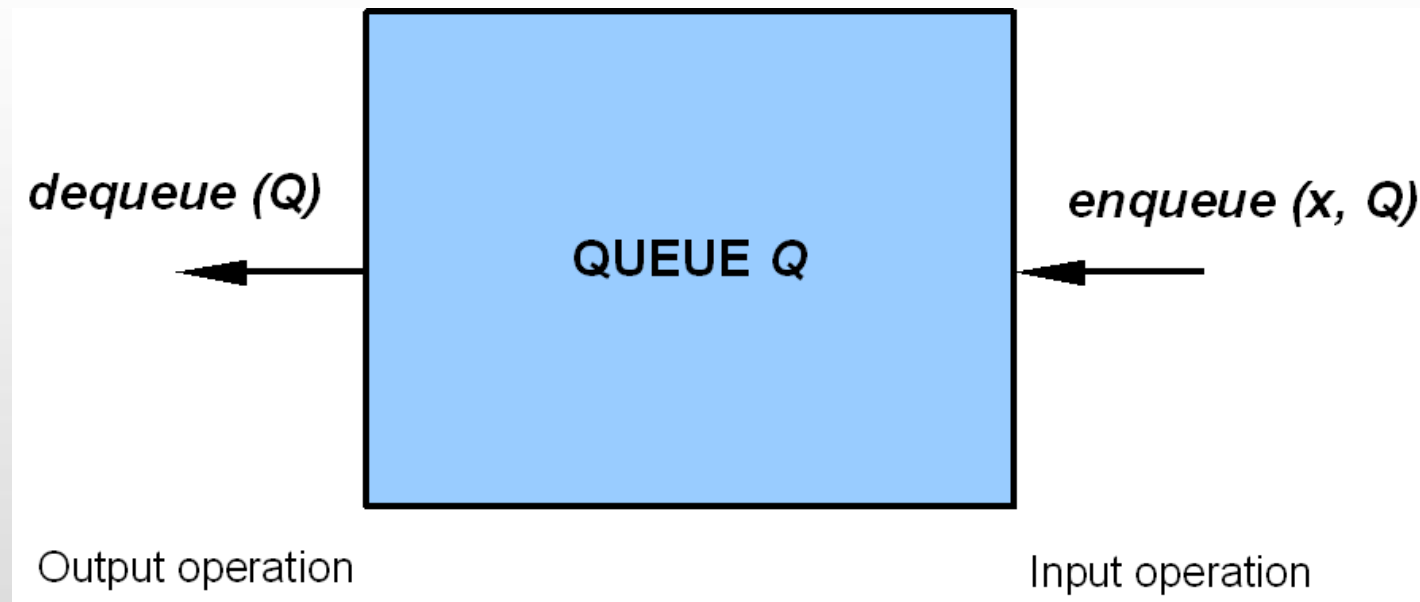


6. Heaps

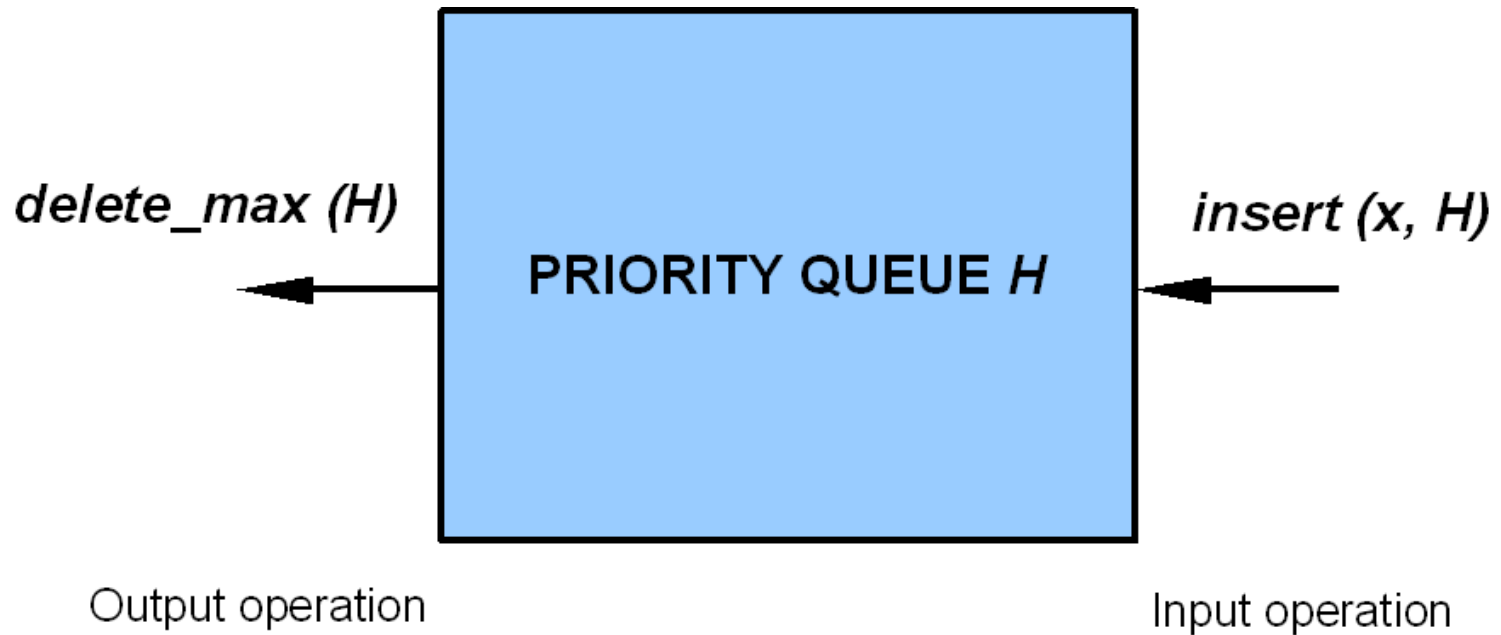


Priority Queue

- Recall Queue ADT Model



Priority Queue Model



Priority Queue

Basic Operations:

- Insert a key
- Delete the maximum

Possible Implementations:

- Linked List
- BST
- Heap



Binary Heap

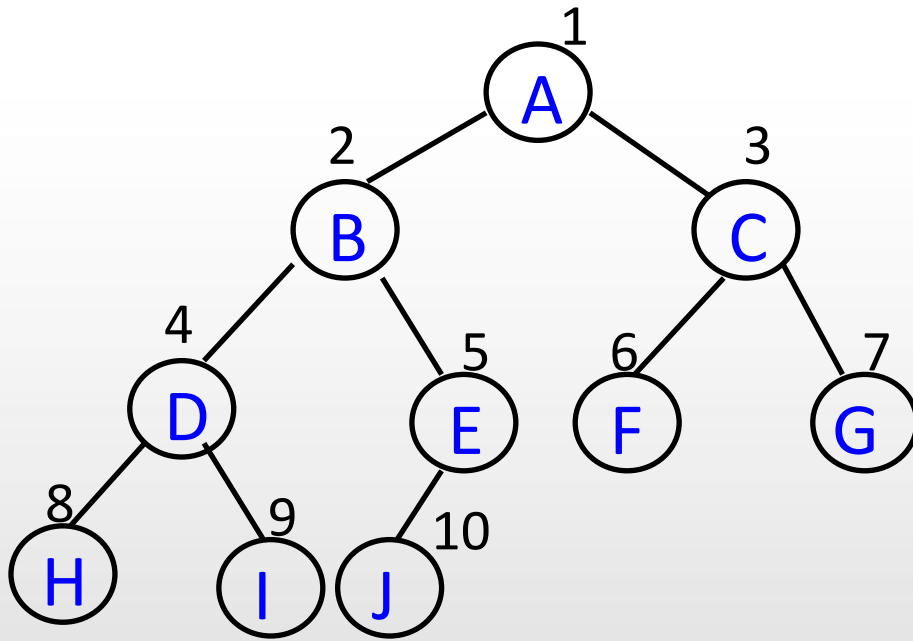
Two important properties:

1. Structure property

- A heap is a complete binary tree (i.e. completely filled, with the possible exception of the bottom level, which is filled from left to right)
- Since a complete binary tree is regular, it can be represented in an array and no pointers are necessary.



Complete Binary Tree



For any element in array[i],
the left child is in position $2i$,
the right child is in $2i+1$, and
the parent is in $\lfloor i/2 \rfloor$.

	A	B	C	D	E	F	G	H	I	J		
0	1	2	3	4	5	6	7	8	9	10	11	12



Priority Queue

```
typedef struct node{  
    int max_heap_size;  
    int size;  
    int *elements;  
}heap;
```



Priority Queue

```
heap *create(int max){
    heap *h;

    h = (heap *)malloc(sizeof(heap));
    if(h==NULL)
        error("Out of space!");

    h->elements = (int *)malloc(sizeof(int)*(max+1));
    if(h->elements==NULL)
        error("Out of space!");

    h->max_heap_size = max;
    h->size = 0;

    return h;
}
```



Binary Heap

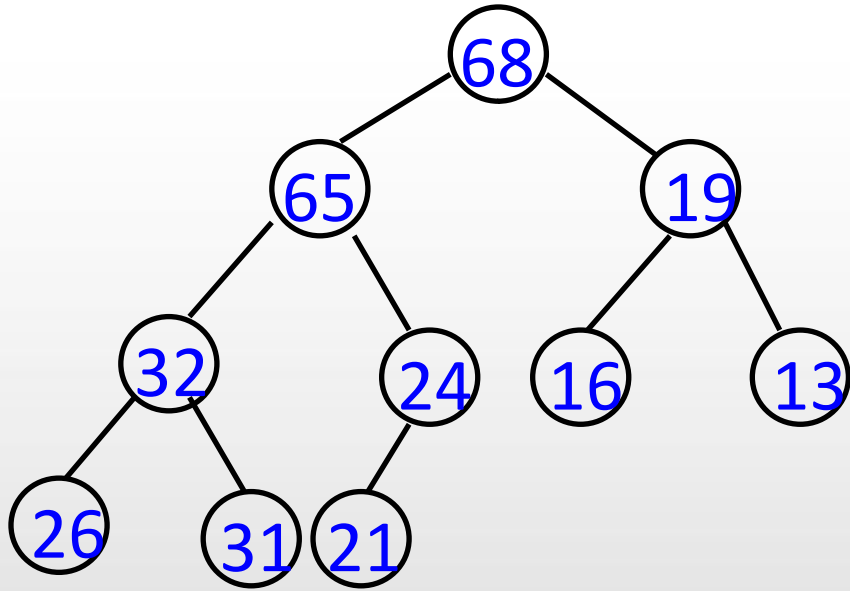
Two important properties:

2. Heap order property

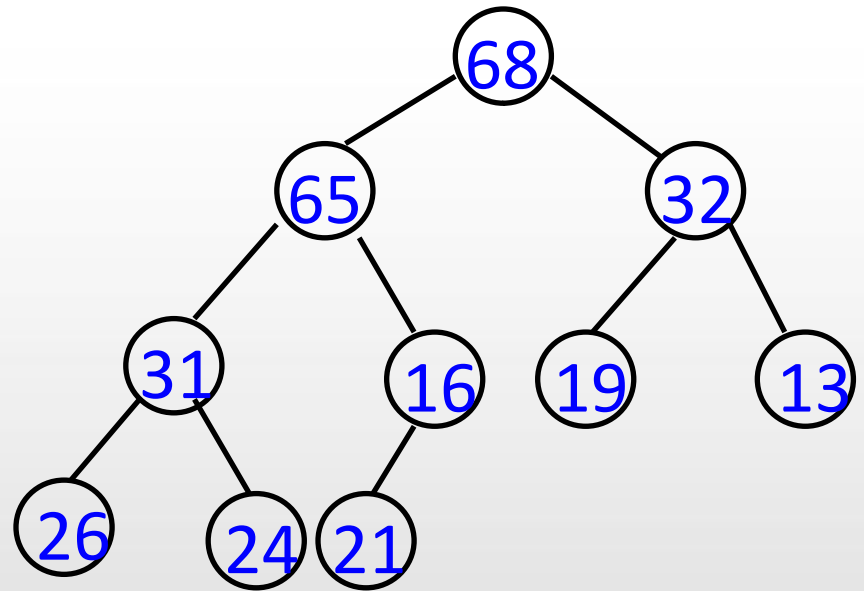
- In a heap, for every node X , the key in the parent of X is larger than the key in X , except the root.
- By this property, the maximum element can always be found at the root.



Heap



A



B



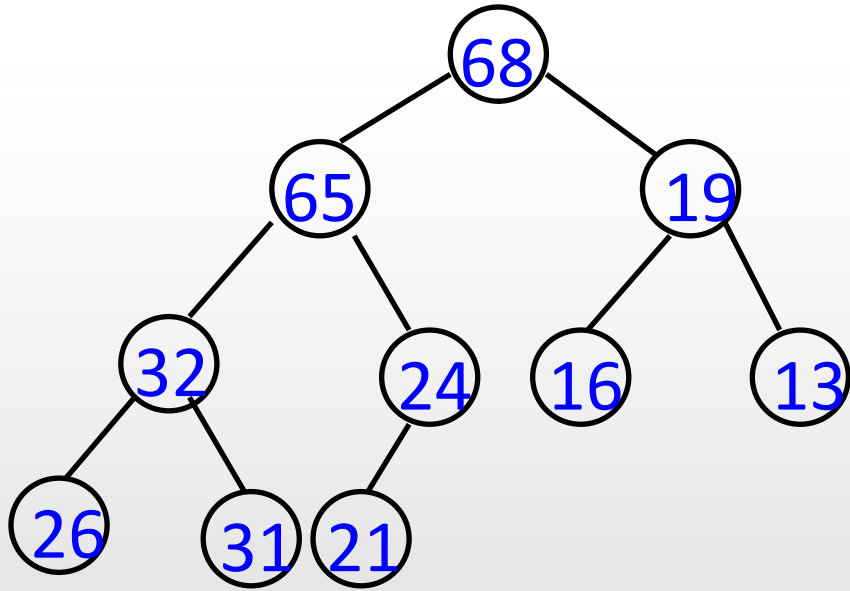
Binary Heap

Operations:

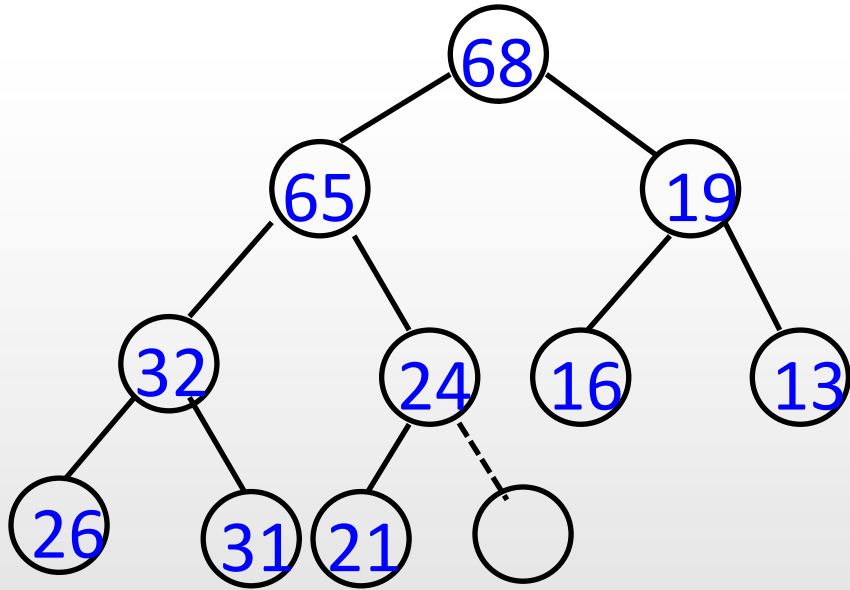
- Insert
- Delete max
- * Build heap



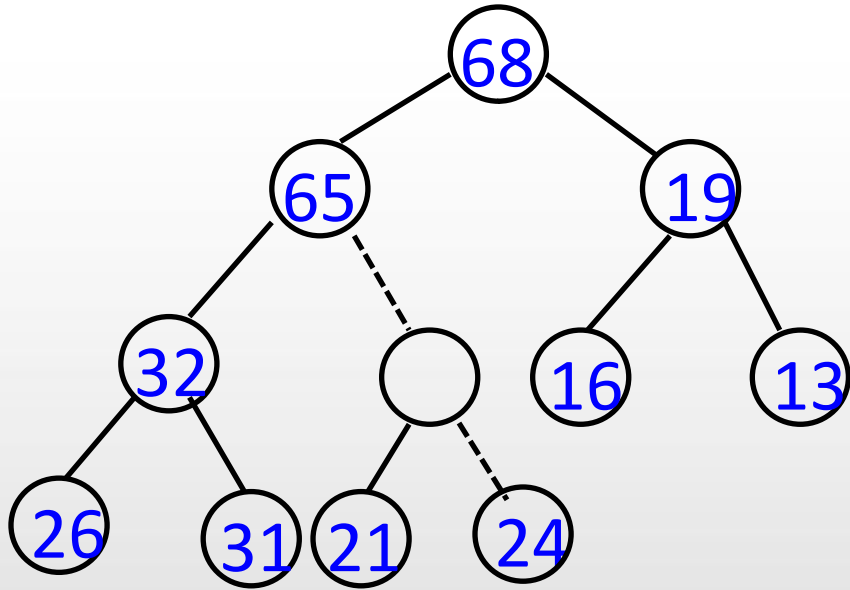
Heap - Insert



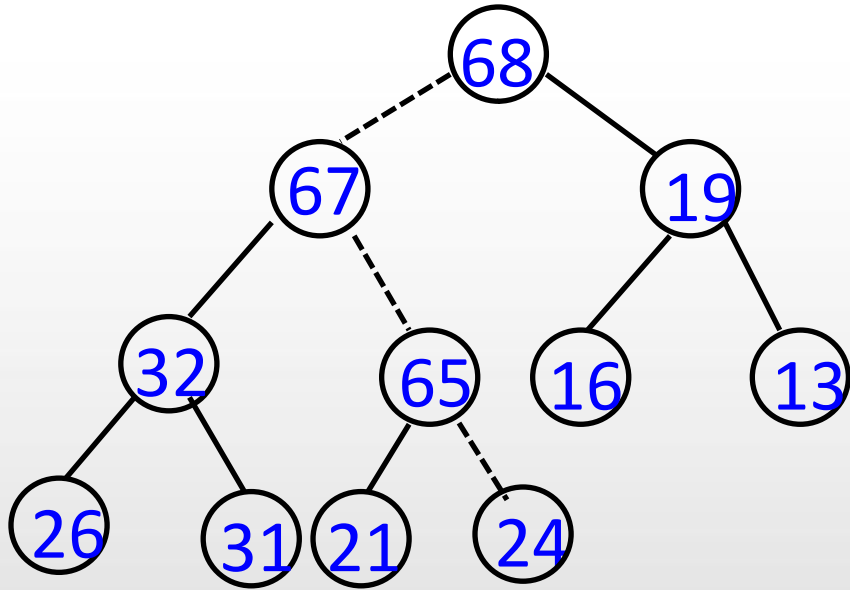
Heap – Insert 67



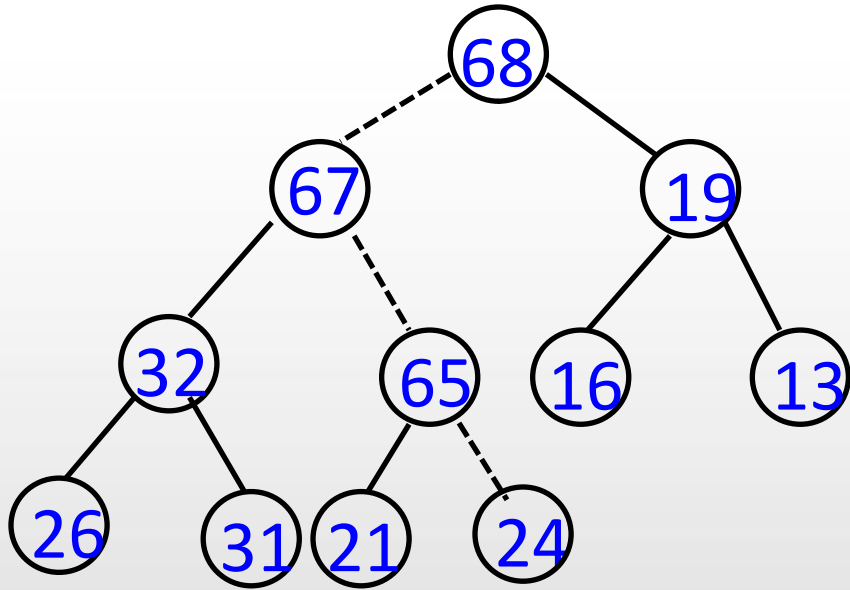
Heap – Insert 67



Heap – Insert 67



Heap – Insert 67



- Strategy: “percolate up”



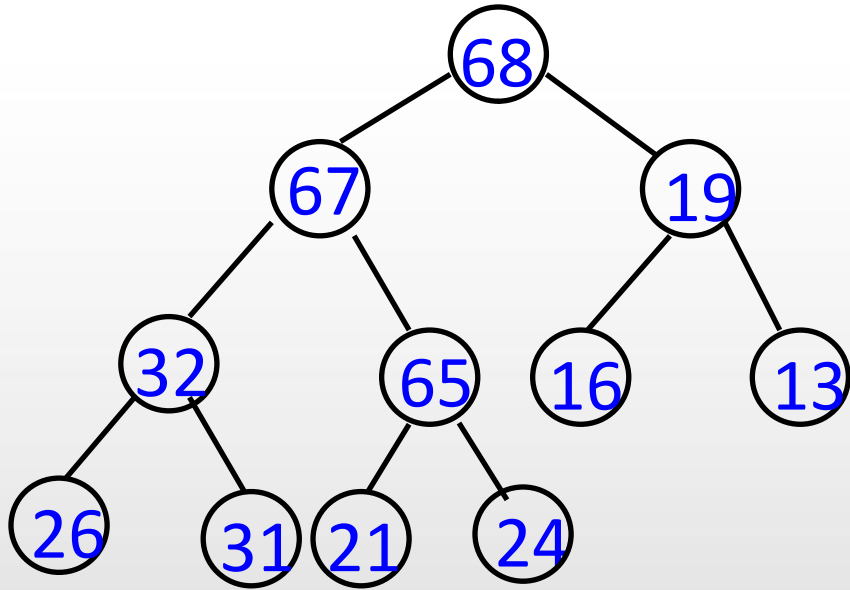
Priority Queue

```
void insert(int x, heap *h) {
    int i;

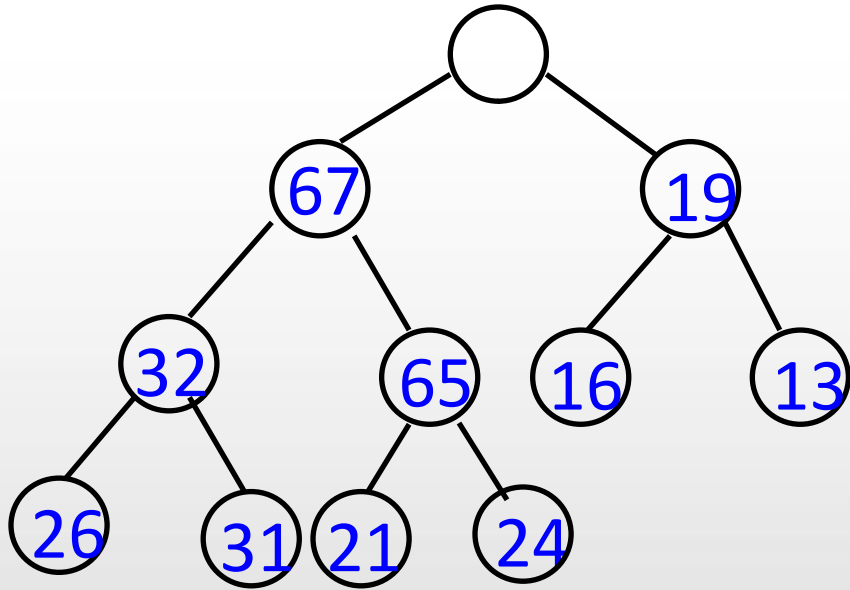
    if(is_full(h))
        error("Priority Queue is full!");
    else{
        i = ++h->size;
        while(h->elements[i/2]<x) {
            h->elements[i]=h->elements[i/2];
            i/=2;
        }
        h->elements[i]=x;
    }
}
```



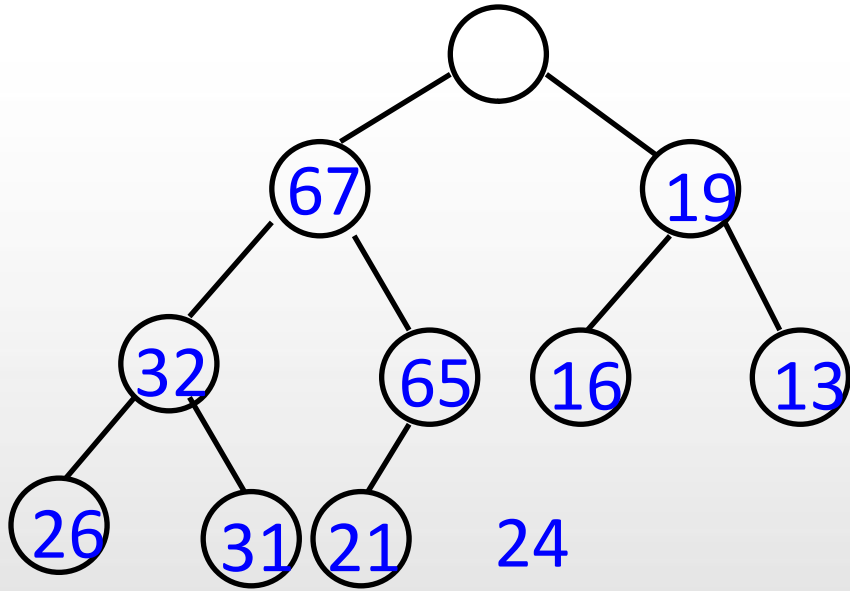
Heap – Delete max



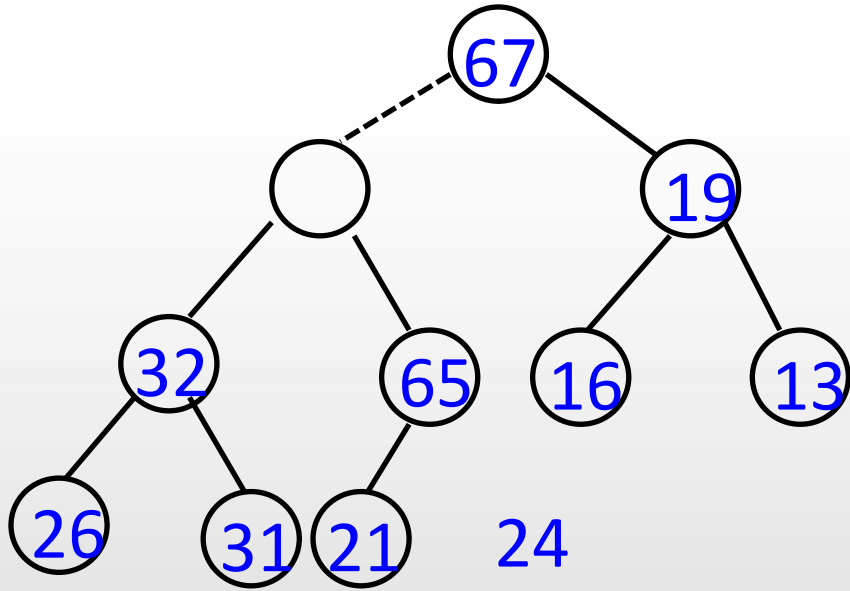
Heap – Delete max



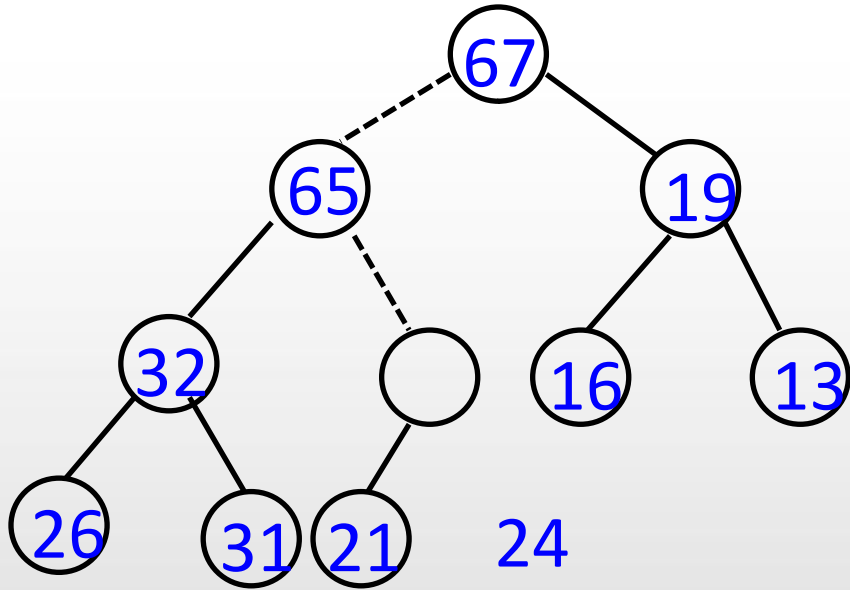
Heap – Delete max



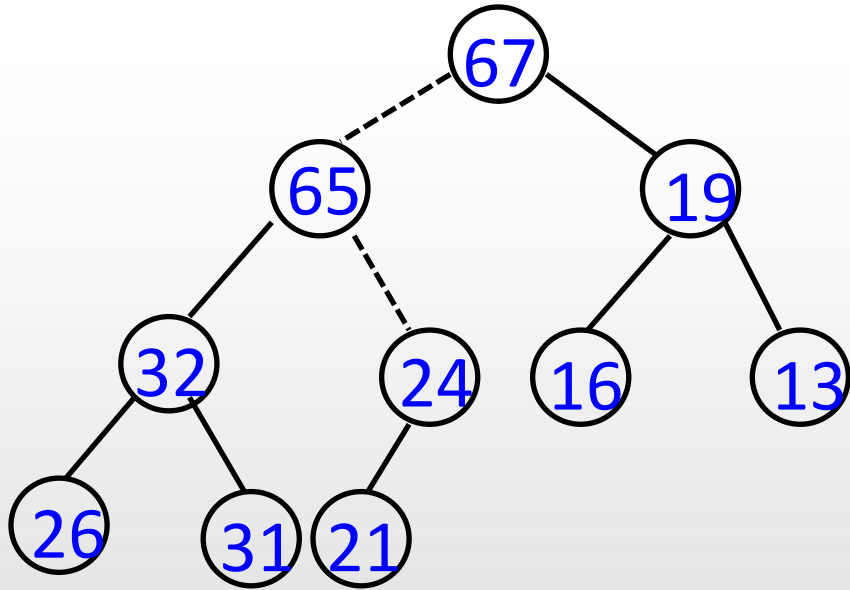
Heap – Delete max



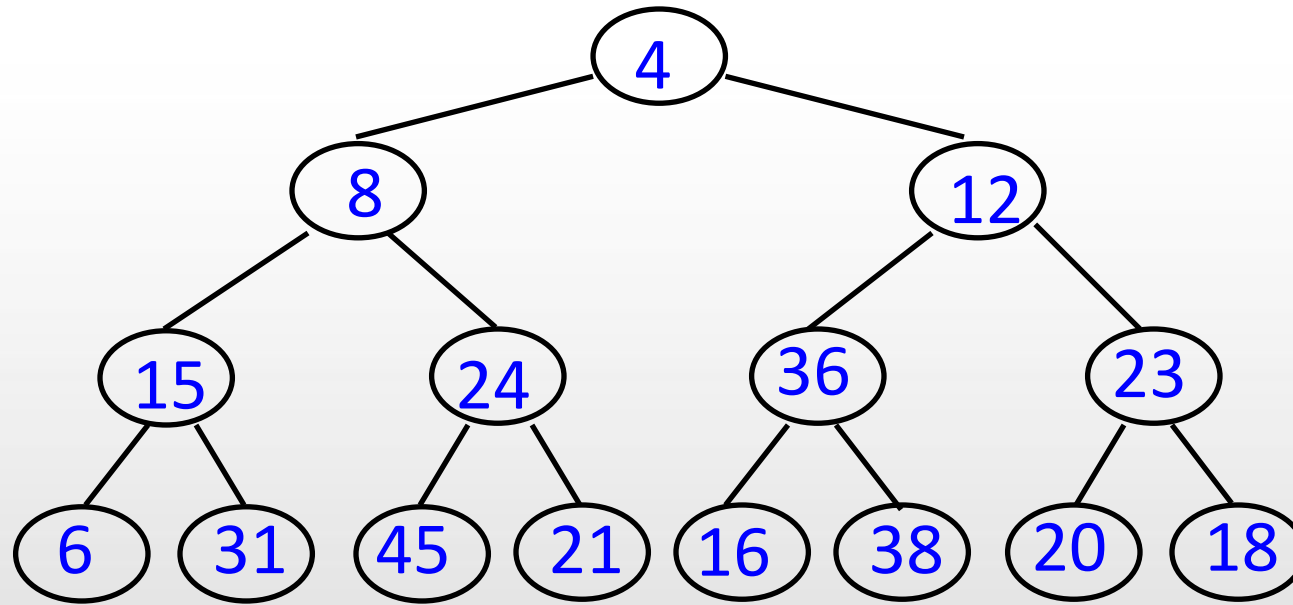
Heap – Delete max



Heap – Delete max



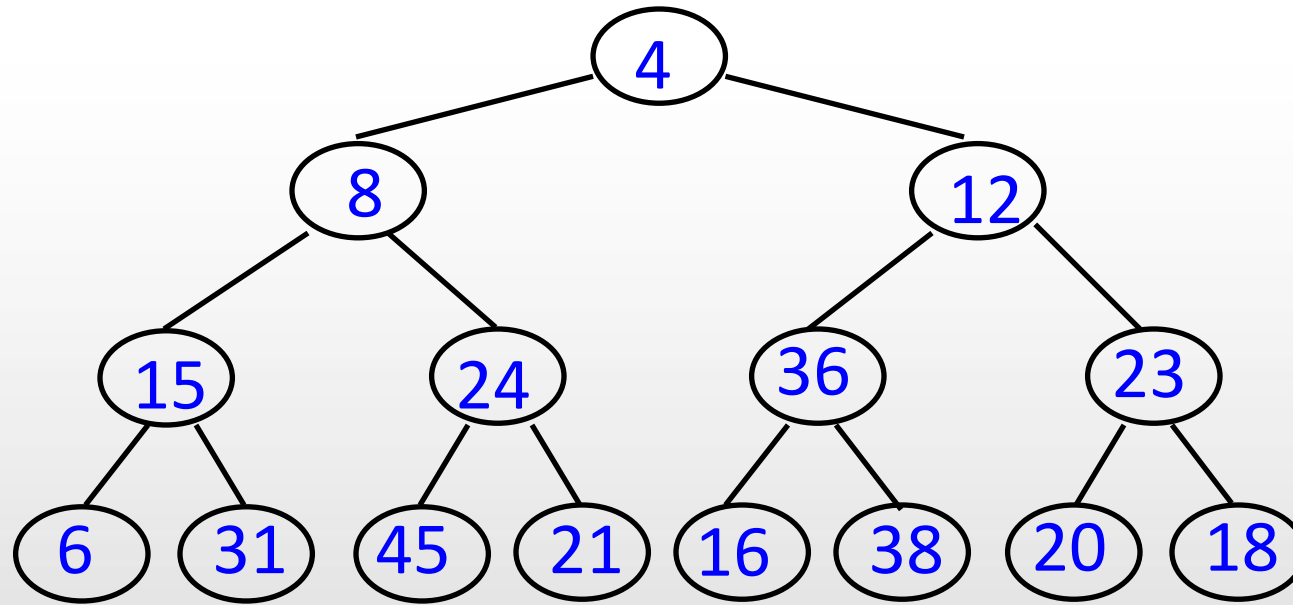
Build heap



- n successive insertions $\approx O(n \log n)$



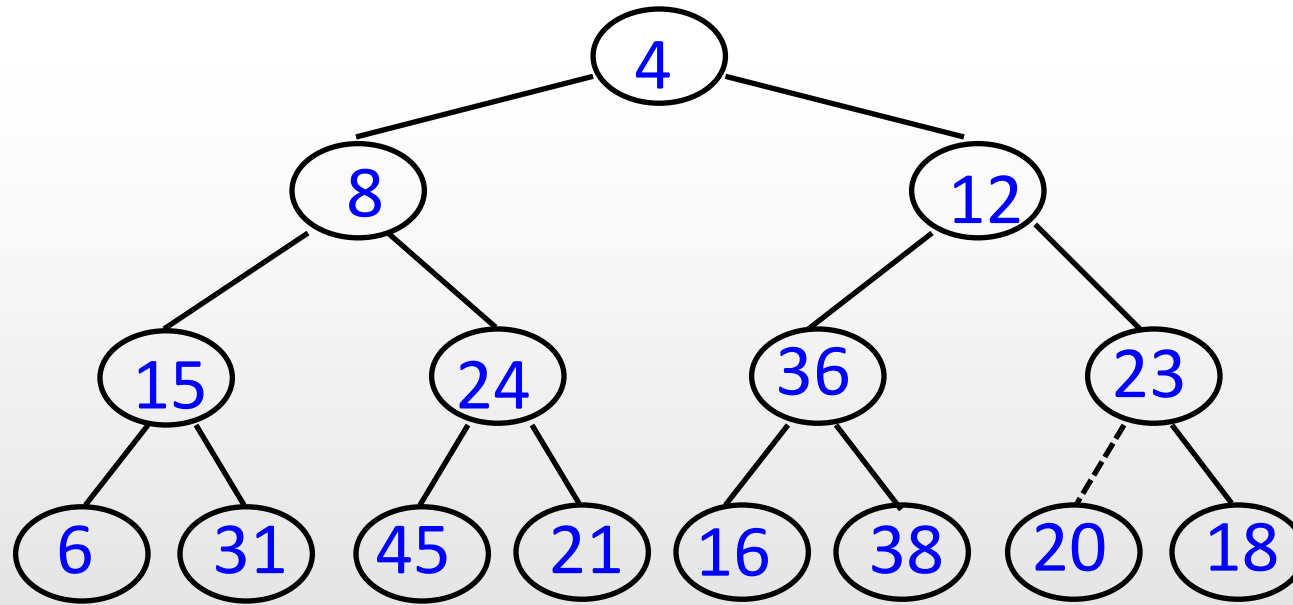
Build heap



- Strategy: “percolate down” from $n/2$



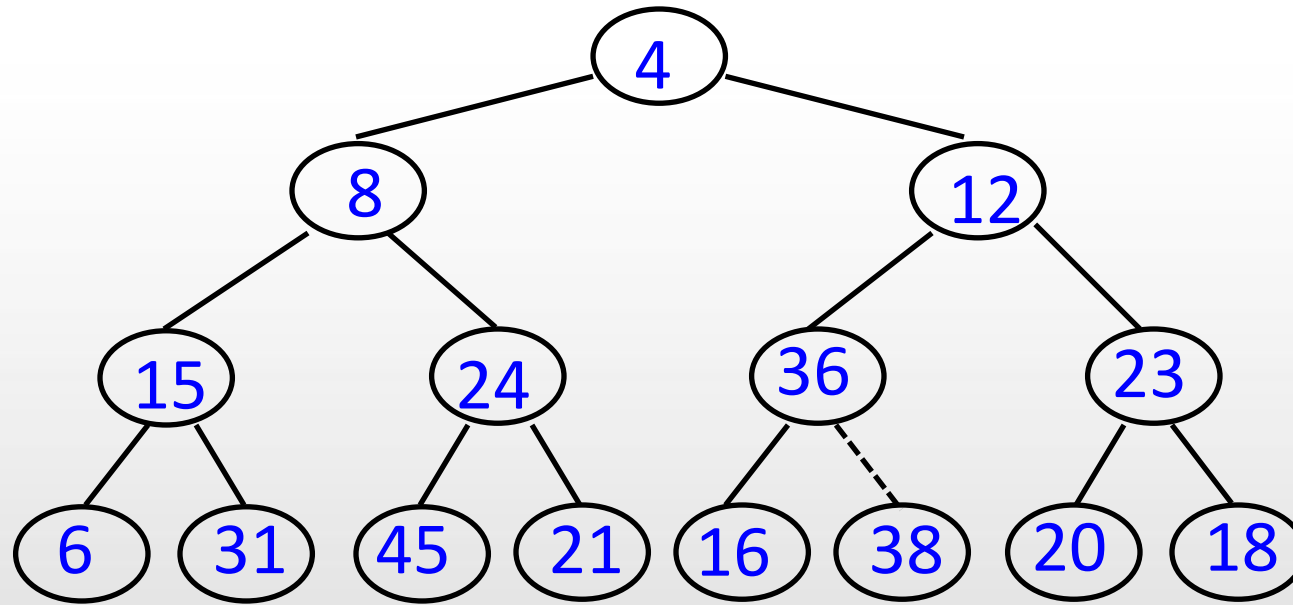
Build heap



- Strategy: percolate down(7)



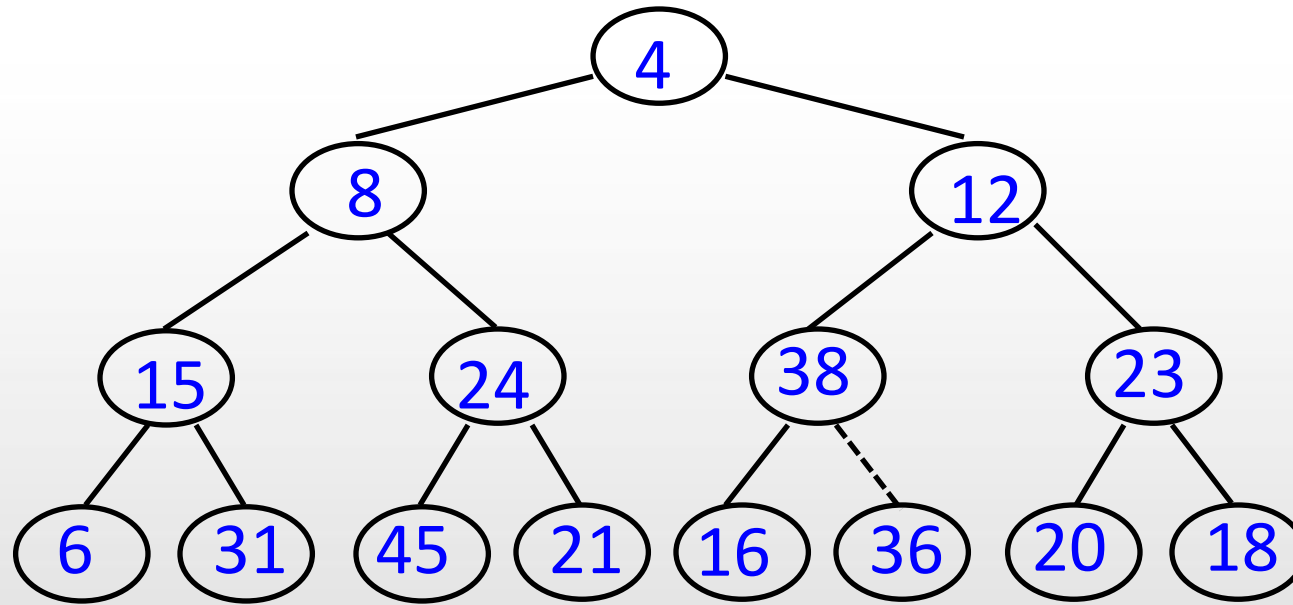
Build heap



- Strategy: percolate down(6)



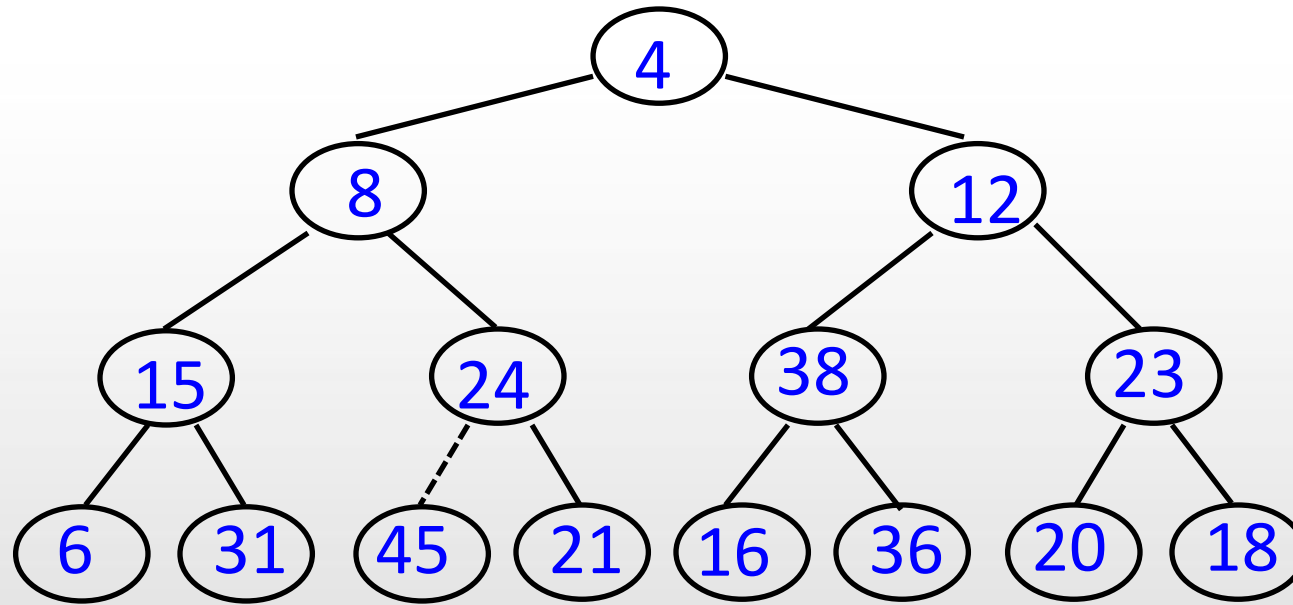
Build heap



- Strategy: percolate down(6)



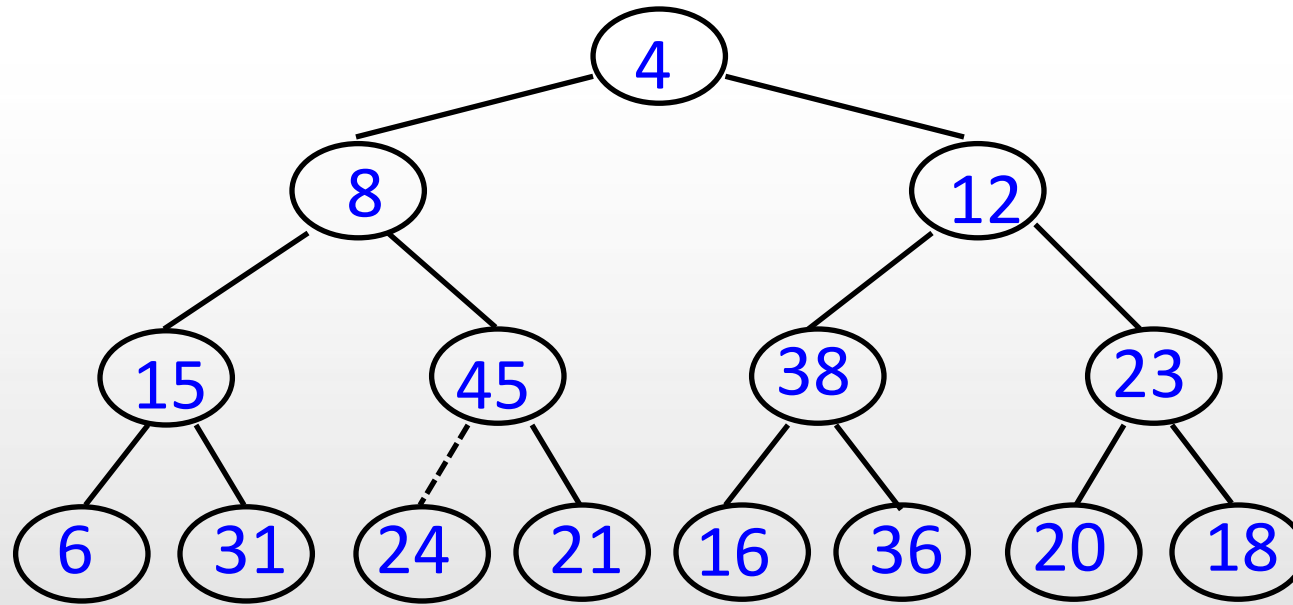
Build heap



- Strategy: percolate down(5)



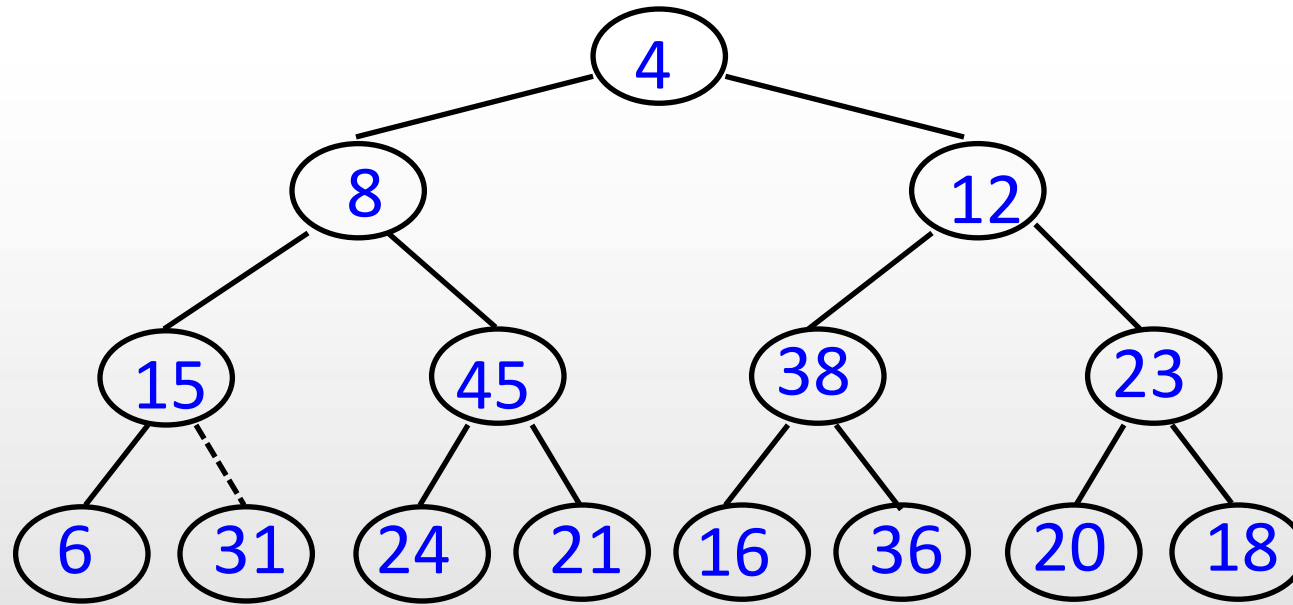
Build heap



- Strategy: percolate down(5)



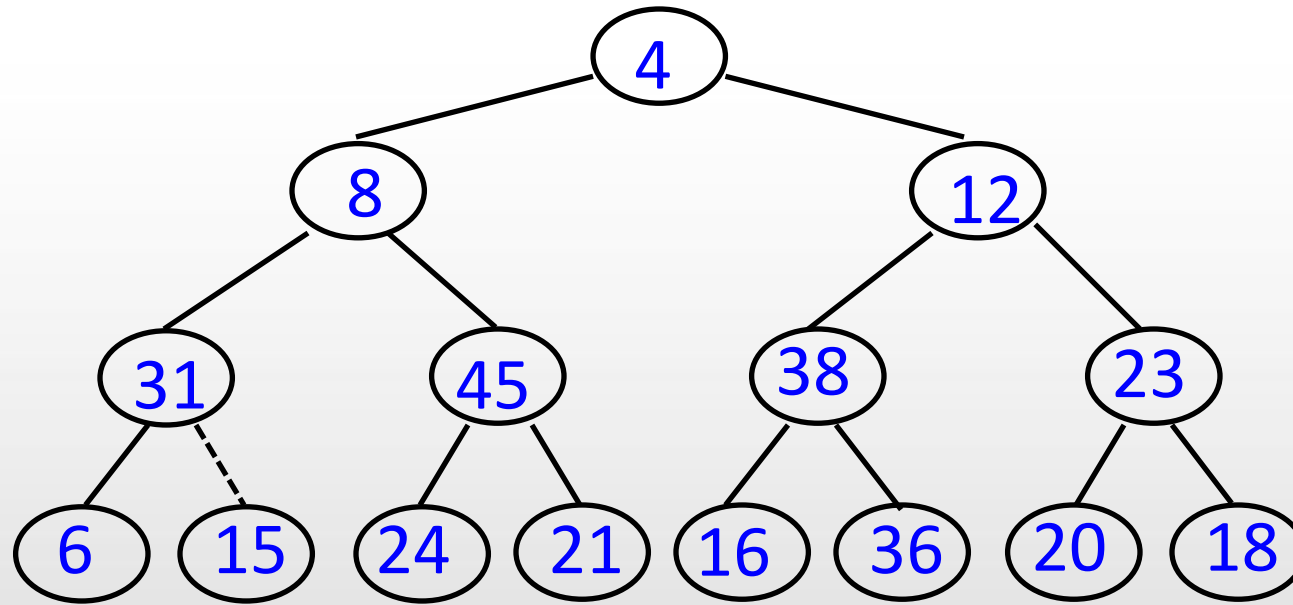
Build heap



- Strategy: percolate down(4)



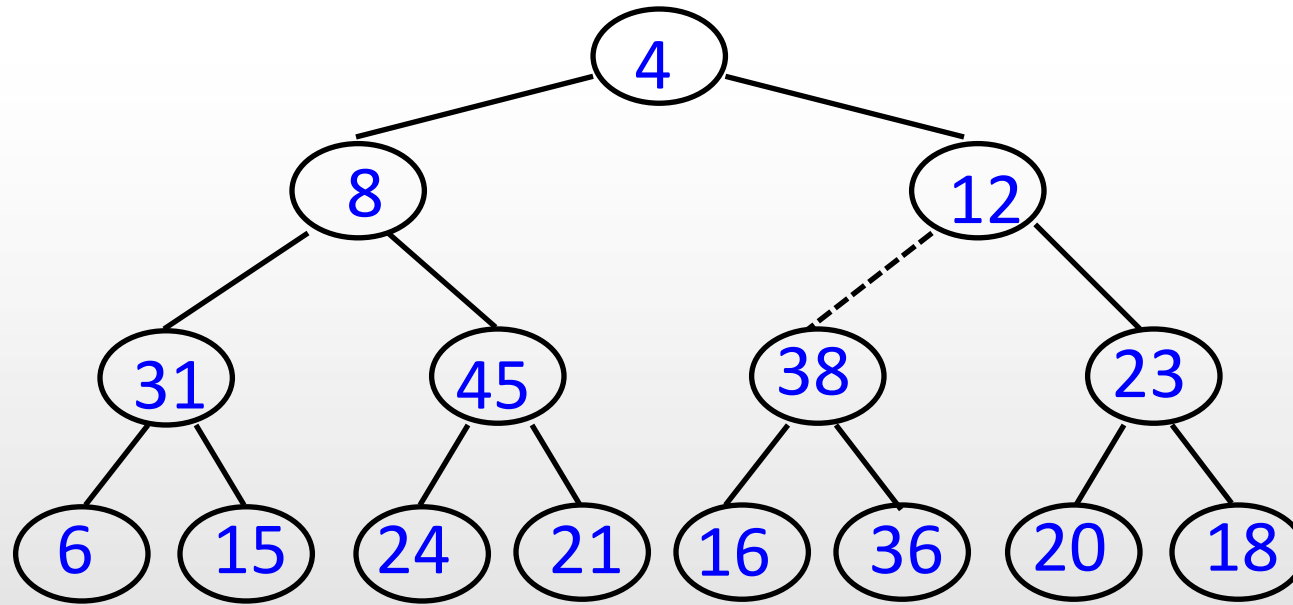
Build heap



- Strategy: percolate down(4)



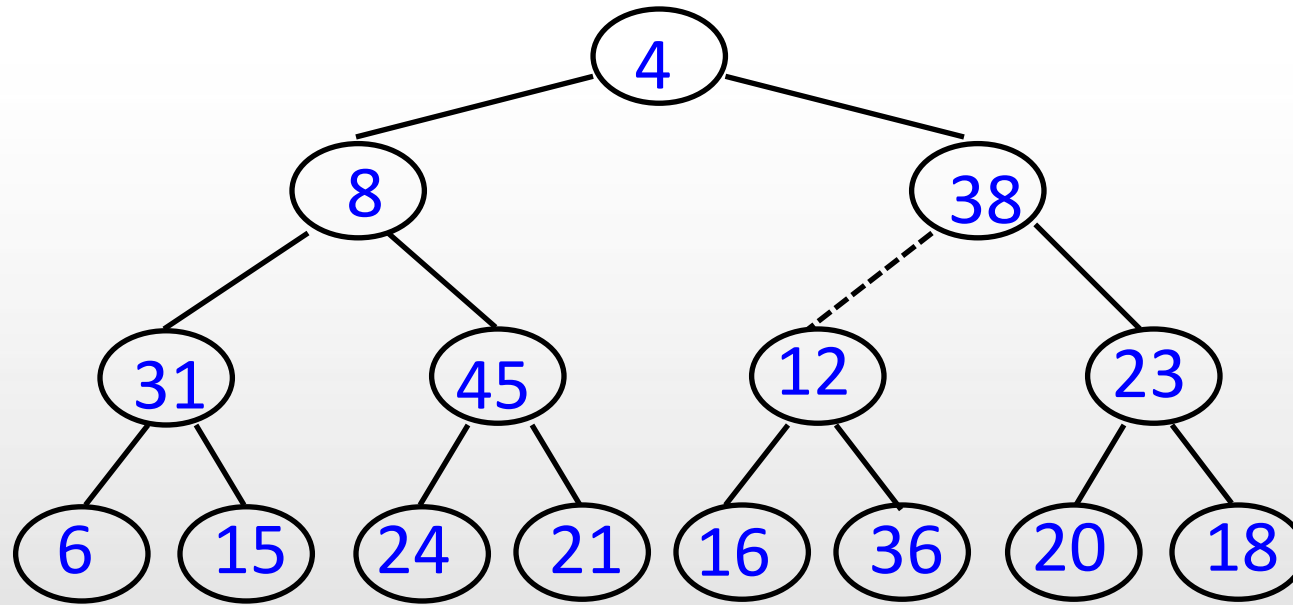
Build heap



- Strategy: percolate down(3)



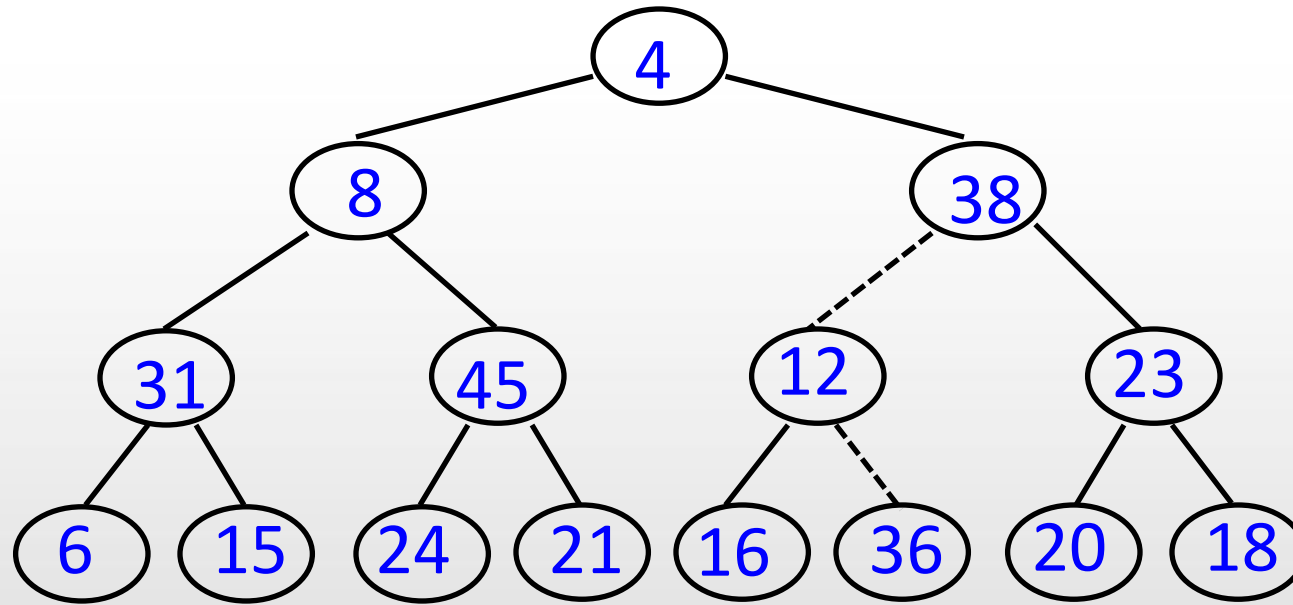
Build heap



- Strategy: percolate down(3)



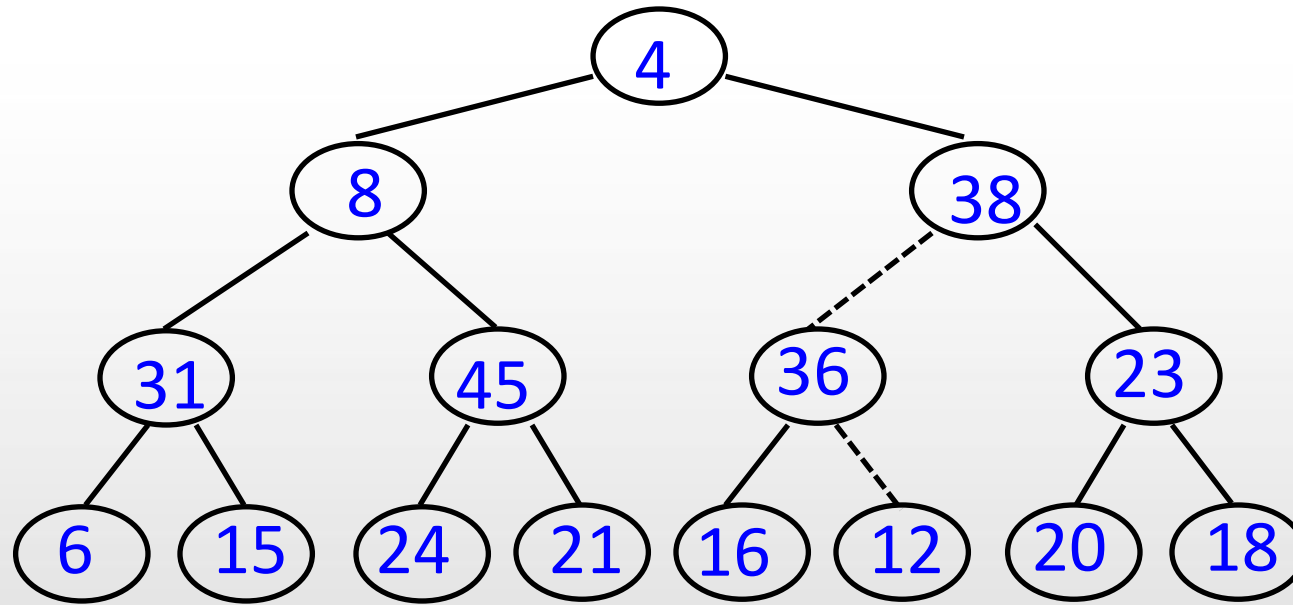
Build heap



- Strategy: percolate down(3)



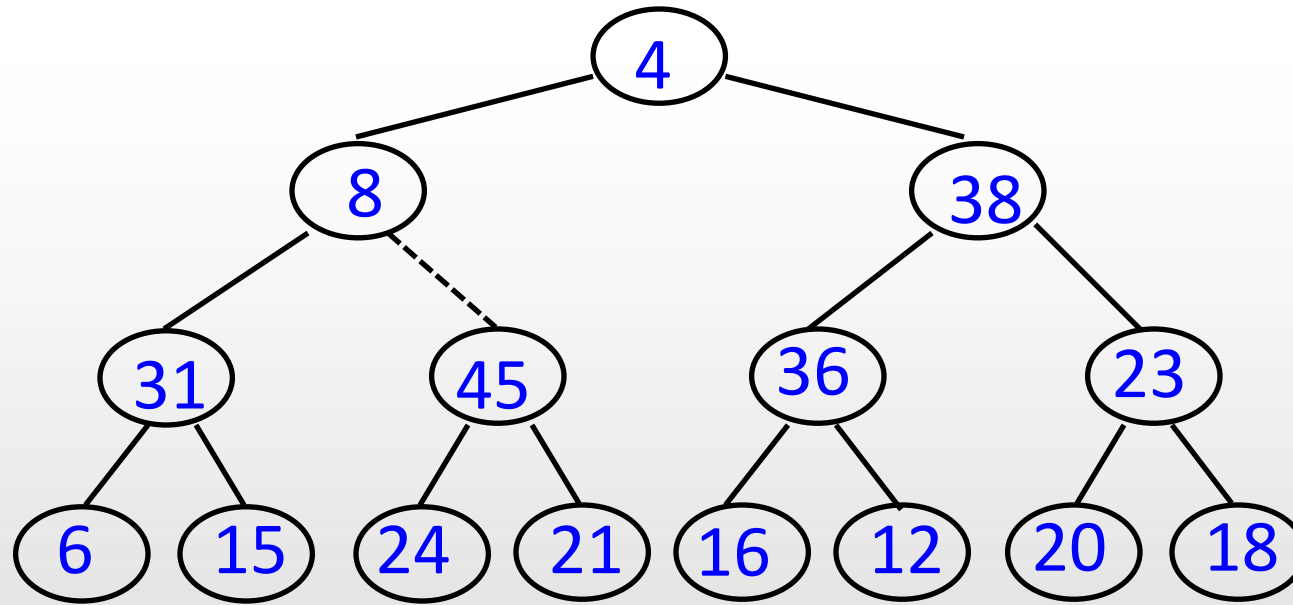
Build heap



- Strategy: percolate down(3)



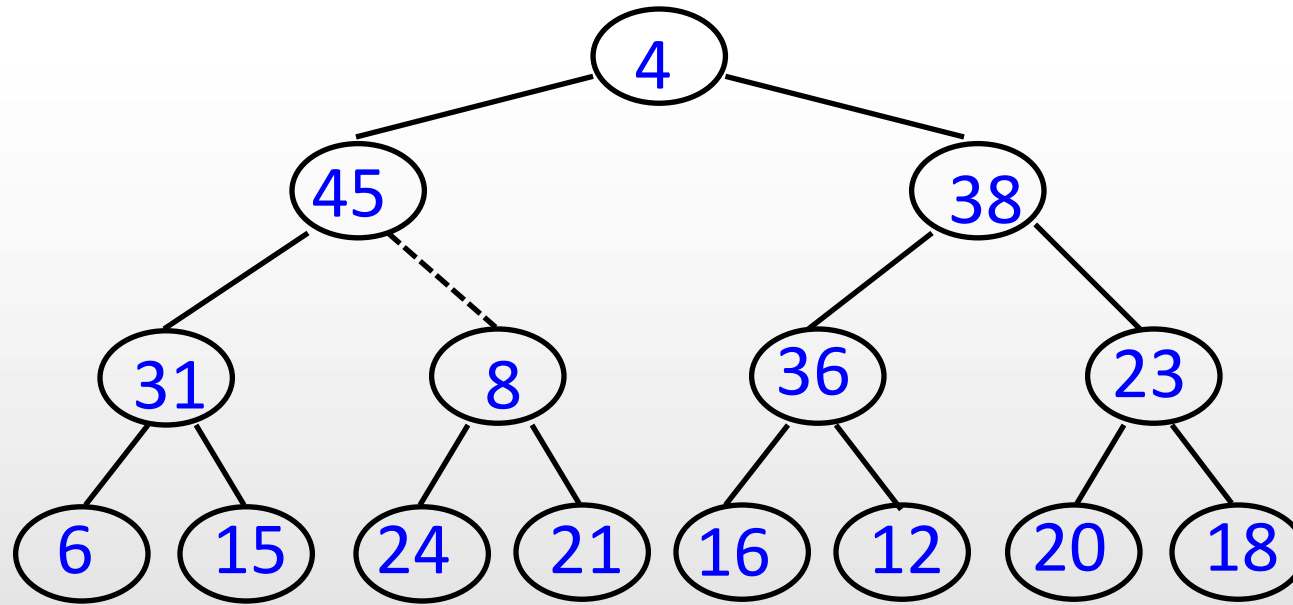
Build heap



- Strategy: percolate down(2)



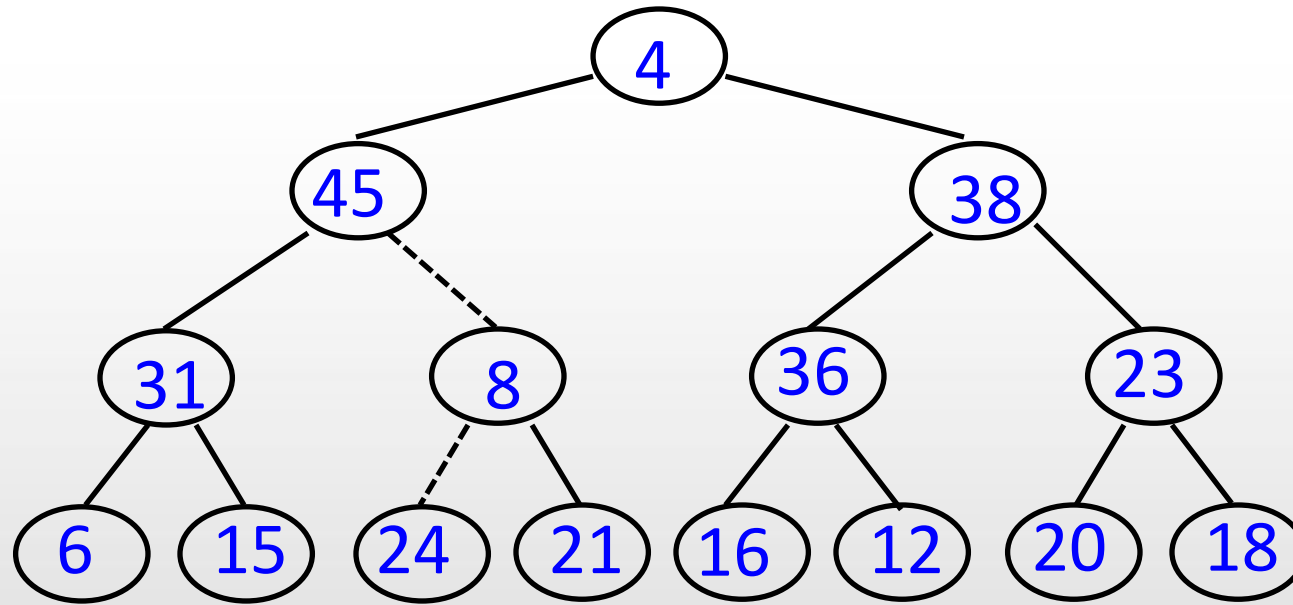
Build heap



- Strategy: percolate down(2)



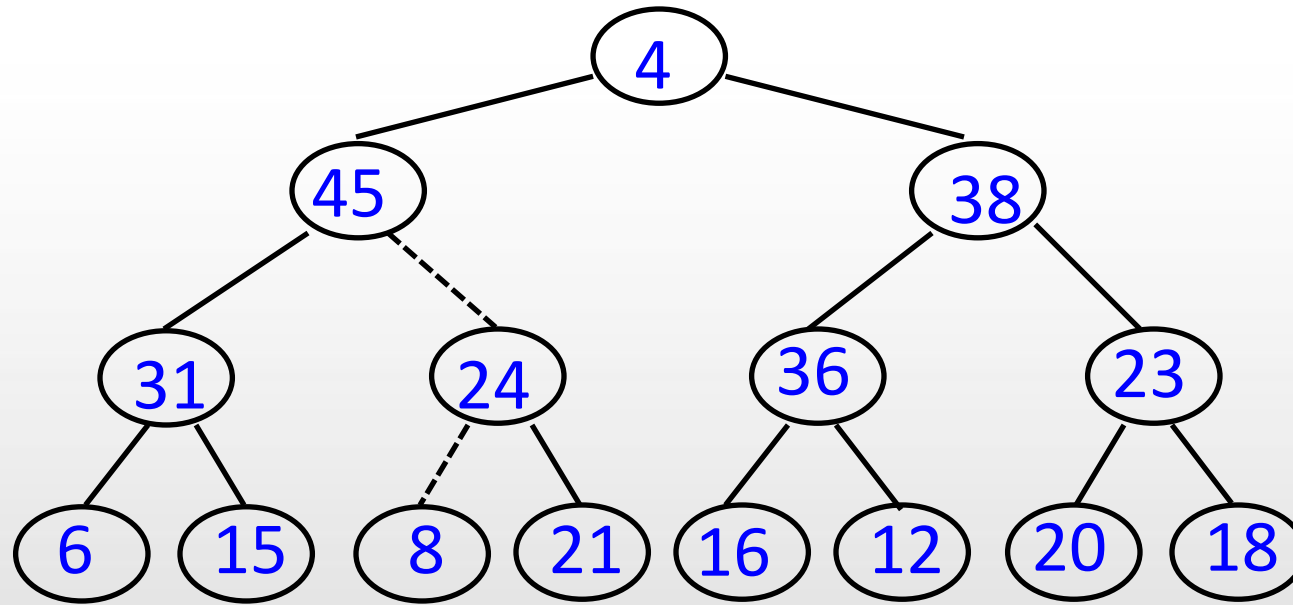
Build heap



- Strategy: percolate down(2)



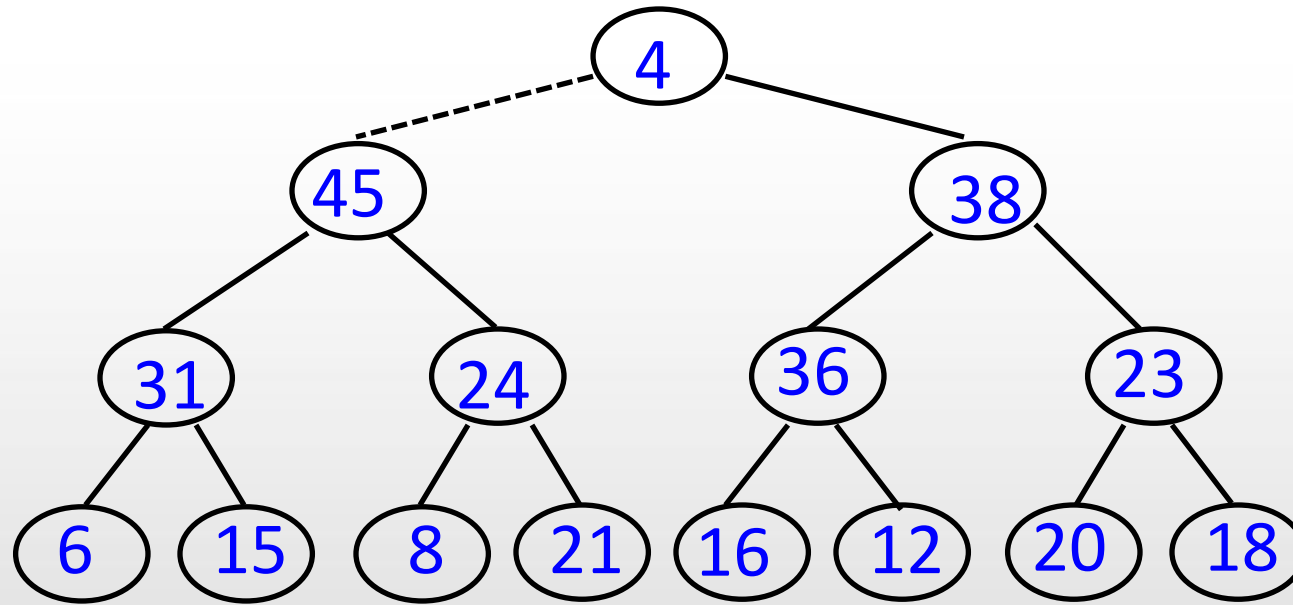
Build heap



- Strategy: percolate down(2)



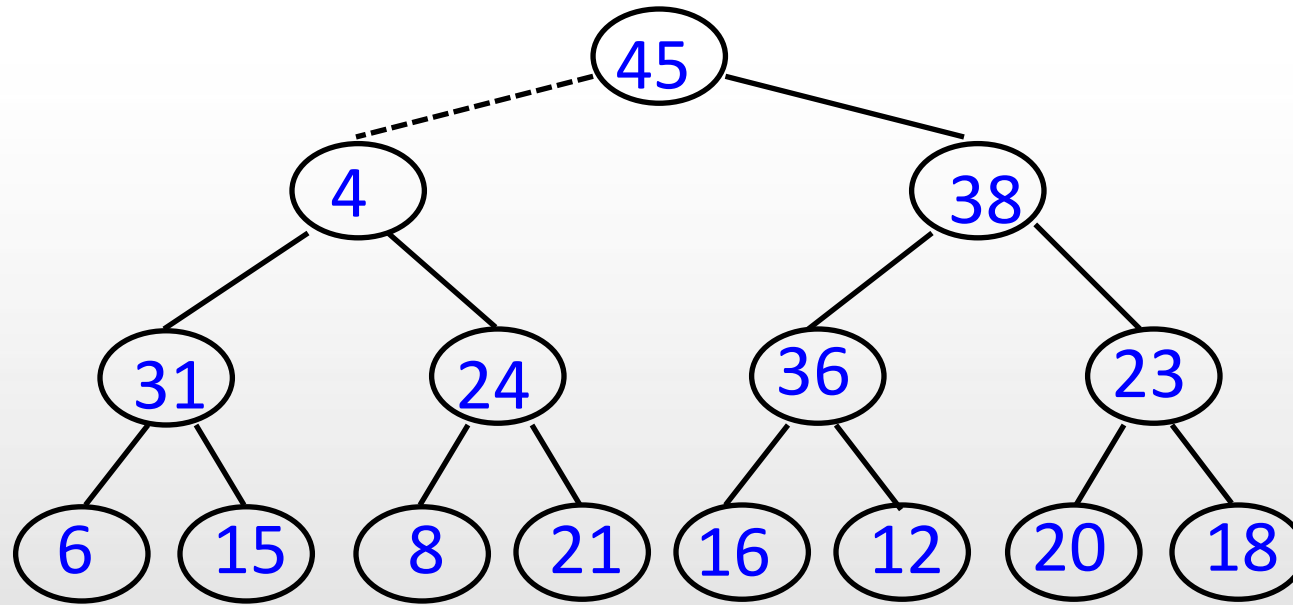
Build heap



- Strategy: percolate down(1)



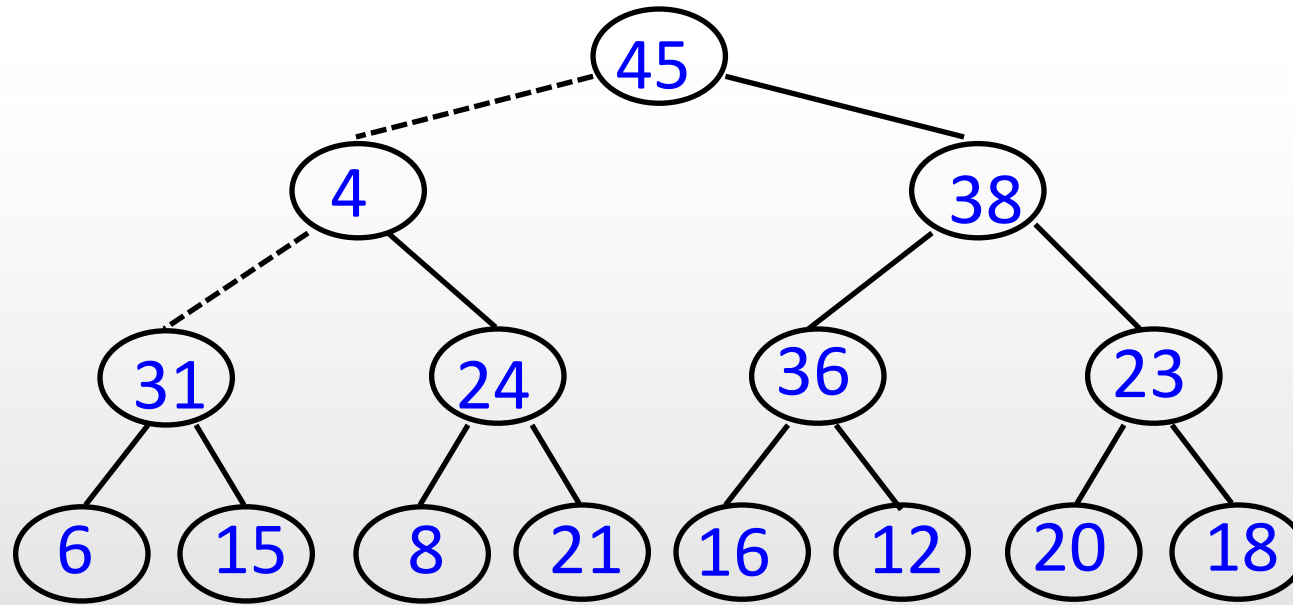
Build heap



- Strategy: percolate down(1)



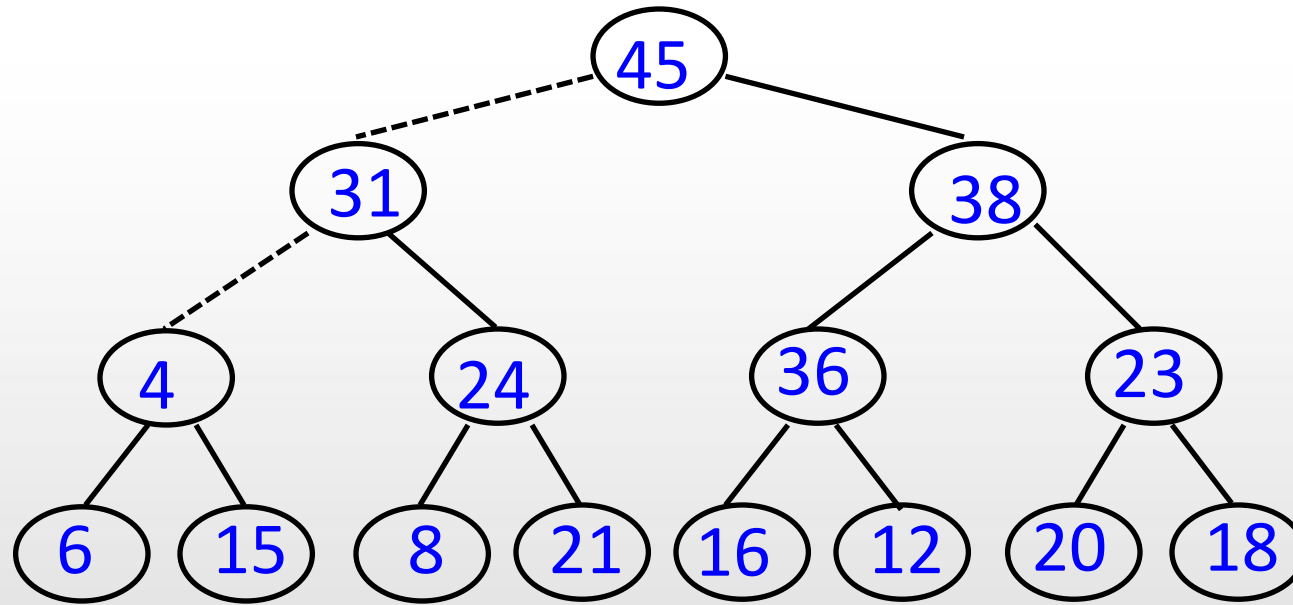
Build heap



- Strategy: percolate down(1)



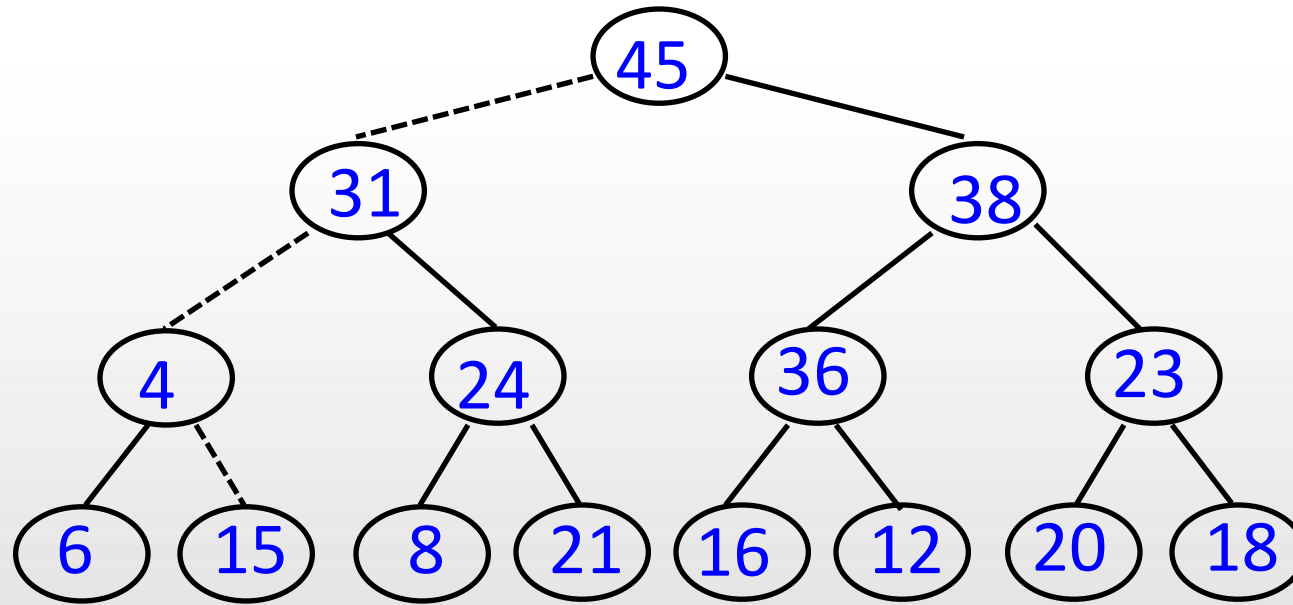
Build heap



- Strategy: percolate down(1)



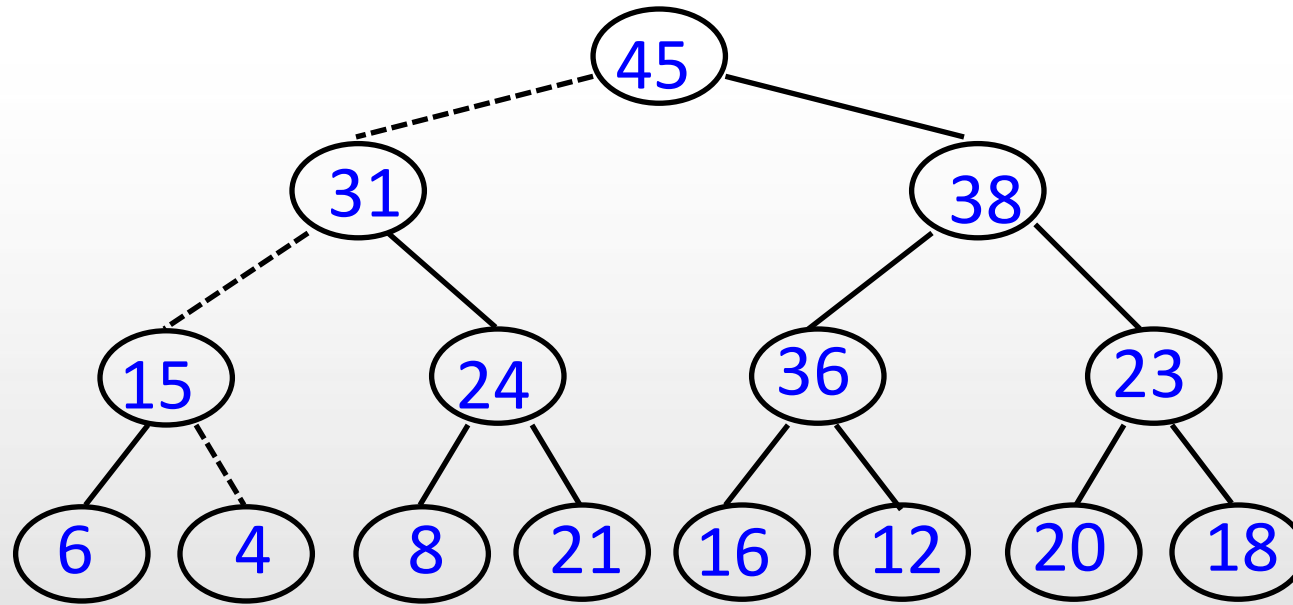
Build heap



- Strategy: percolate down(1)



Build heap

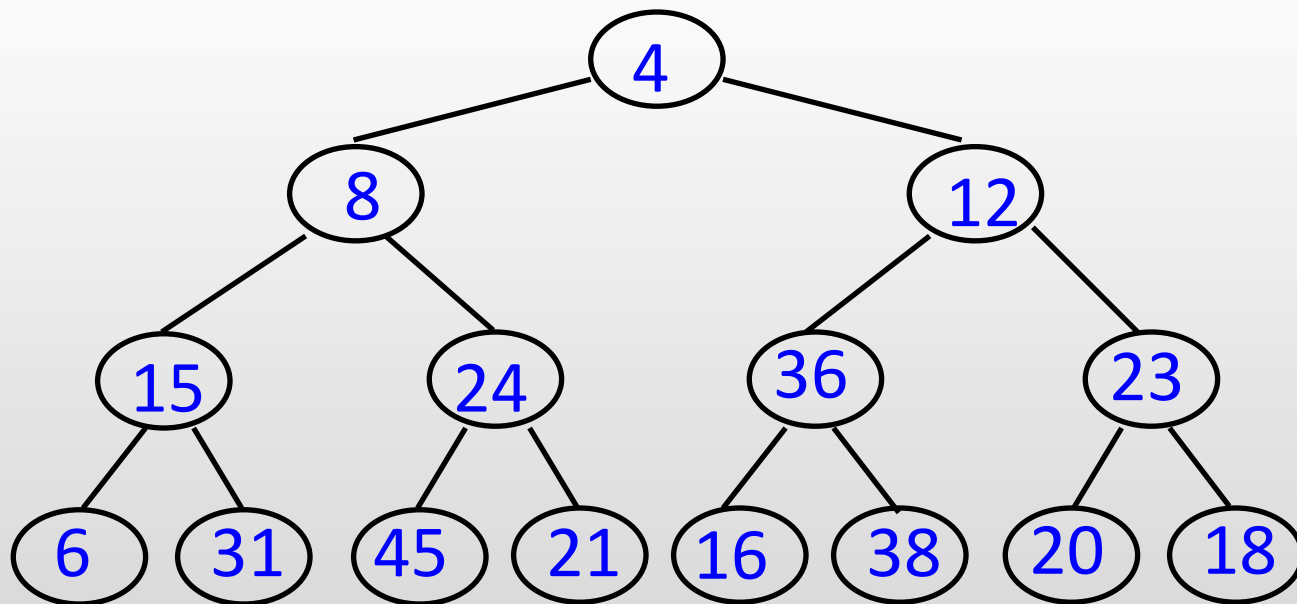


- Strategy: percolate down(1)



Build heap

```
for (i=n/2; i>0; i--)  
    percolate_down(i);
```



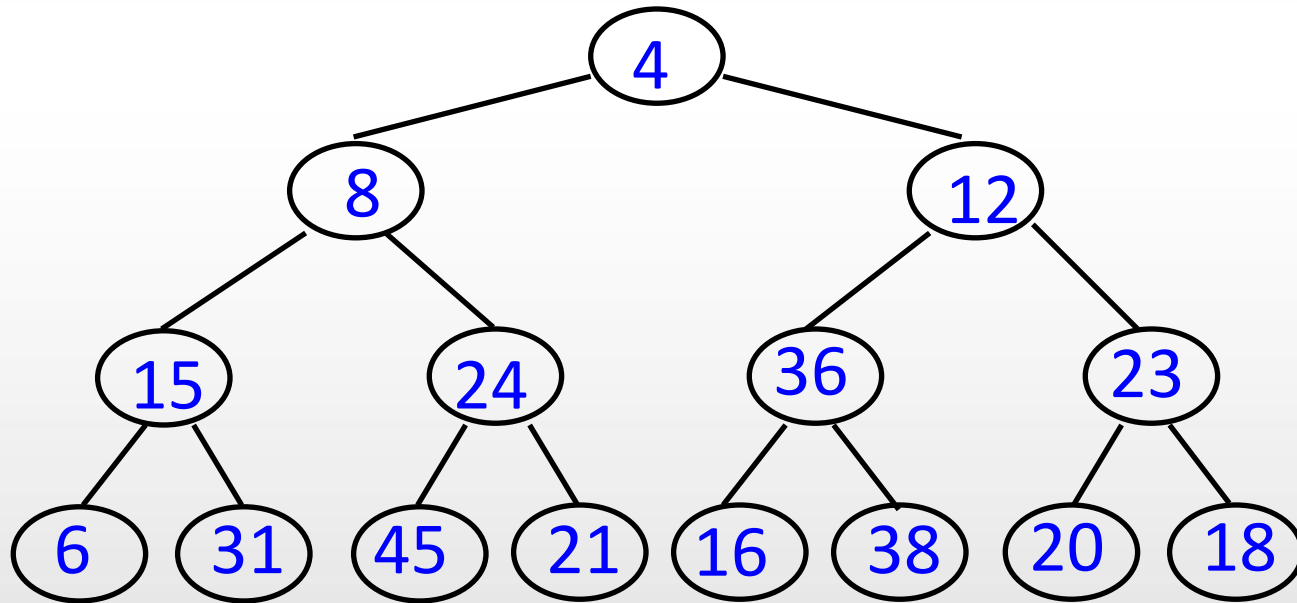
Build heap

```
for (i=n/2; i>0; i--)  
    percolate_down(i);
```

- To bound the running time of `build_heap`, we must bound the number of possible swaps.
- This can be done by computing the sum of the heights of all the nodes in the heap.



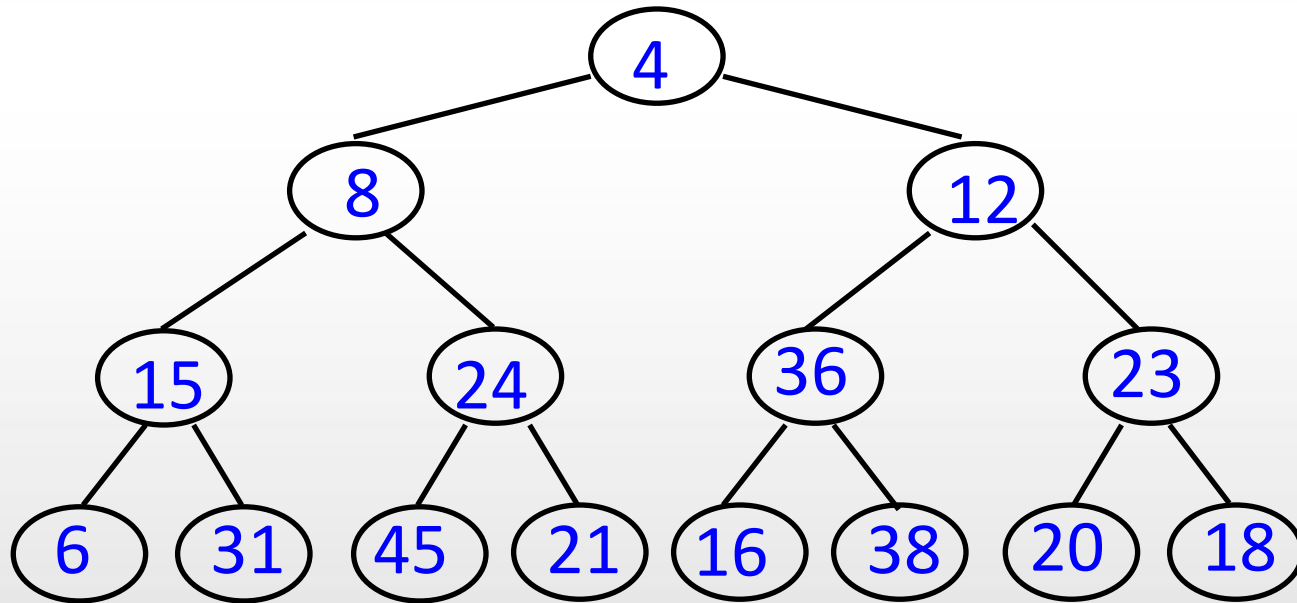
Build heap



- This tree consists of 1 node at height h , 2 nodes at height $h-1$, 2^2 nodes at height $h-2$, and in general 2^i nodes at height $h-i$.



Build heap



- The sum of the heights of all the nodes is then

$$S = \sum_{i=0}^h 2^i (h-i)$$



Build heap

- The sum of the heights of all the nodes is then

$$S = \sum_{i=0}^h 2^i (h-i)$$

$$= h + 2(h-1) + 4(h-2) + 8(h-3) + 16(h-4) + \dots + 2^{h-1}(1)$$

$$2S = 2h + 4(h-1) + 8(h-2) + 16(h-3) + \dots + 2^h(1)$$

$$S = -h + 2 + 4 + 8 + \dots + 2^{h-1} + 2^h$$

$$= (2^{h+1} - 1) - (h+1)$$



Build heap

- The sum of the heights of all the nodes is then

$$= (2^{h+1} - 1) - (h + 1)$$

$$= 2^h$$

$$= 2^{\log_2 n}$$

$$= n^{\log_2 2}$$

$$= O(n)$$



Application

- The Selection Problem

Input: List of n elements, which can be totally ordered, and an integer k

Output: Find the k th largest element

Algo1:

- Read elements into an array and sort them, returning the appropriate element. $\approx O(n^2)$



Application

- The Selection Problem

Algo2:

- Read k elements into an array and sort them, the smallest is in the k th position.
- Process the remaining elements one by one. As an element arrives, it is compared with k th element in the array.
- If it is larger, the k th element is removed, and the new element is placed on the correct place among the remaining $k-1$ elements.
- When the algorithm ends, the element in the k th position is the answer. $\approx O(n*k) \approx O(n^2)$



Application

- The Selection Problem

Algo3:

- Read n elements into an array.
- Apply the `build_heap` algorithm.
- Perform k `delete_max` operations.
- The last element extracted from the heap is the answer.

$\approx O(n \log n)$



Application

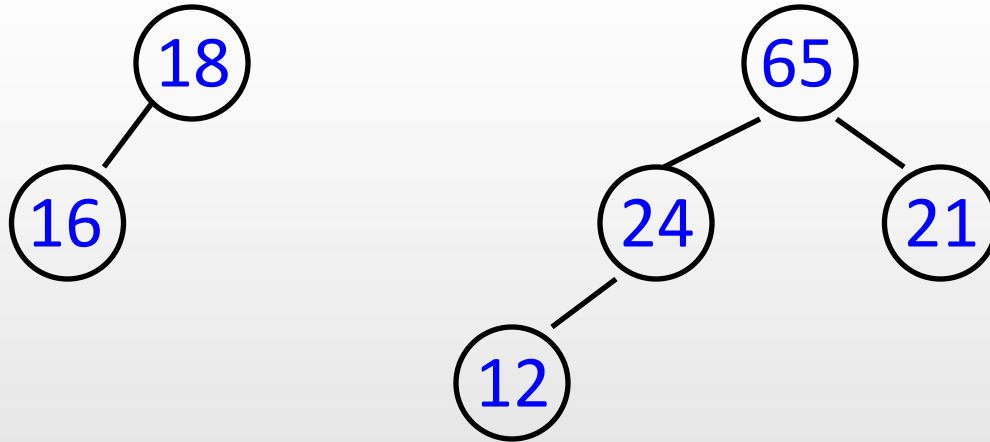
- The Selection Problem

Algo3:

- build_heap $\approx O(n)$
- delete_max $\approx O(\log n)$
- k delete_max $\approx O(k \log n)$
- total $\approx O(n + k \log n)$
- if $k = \lceil n/2 \rceil \approx O(n \log n)$



Merging



6. Heaps

Binomial Queues



Binomial Queues

- Support merging, insertion, and `delete_max` in $O(\log n)$ worst-case time per operation.
- Collection of heap-ordered trees, known as a *forest*.
- Each of the heap-ordered trees are of a constrained form known as a *binomial tree*.

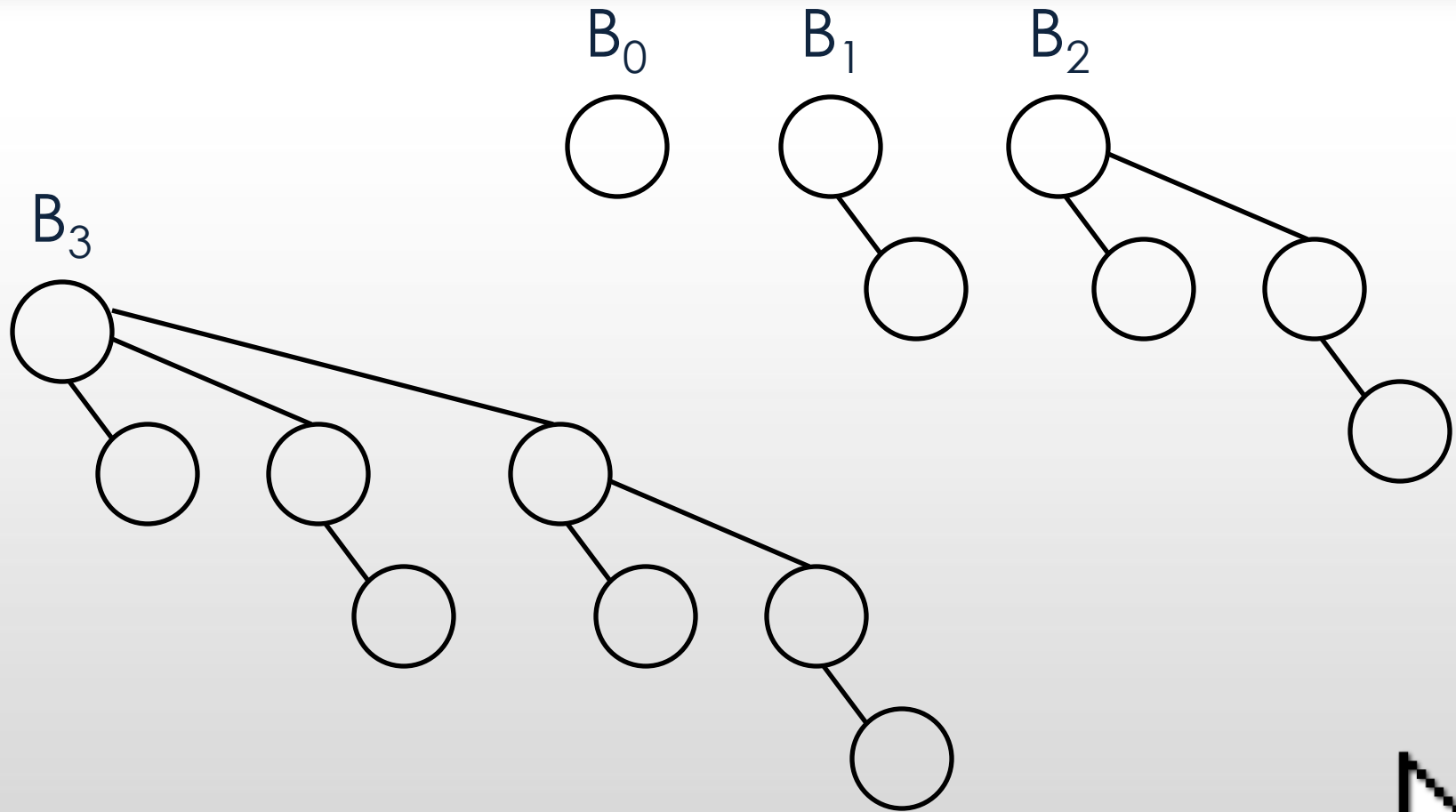


Binomial Queues

- There is at most one binomial tree of every height.
- A binomial tree of height 0 is a one-node tree; a binomial tree, B_k , of height k is formed by attaching a binomial tree, B_{k-1} , to the root of another binomial tree, B_{k-1} .
- Binomial trees of height k have exactly 2^k nodes.



Binomial trees





Priority Queue

- If we impose heap order on the binomial trees and allow at most one binomial tree of any height, we can uniquely represent a priority queue of any size by a collection of binomial trees
- A priority queue of size 13 could be represented by the forest B_3, B_2, B_0 .
- Can also be represented as 1101

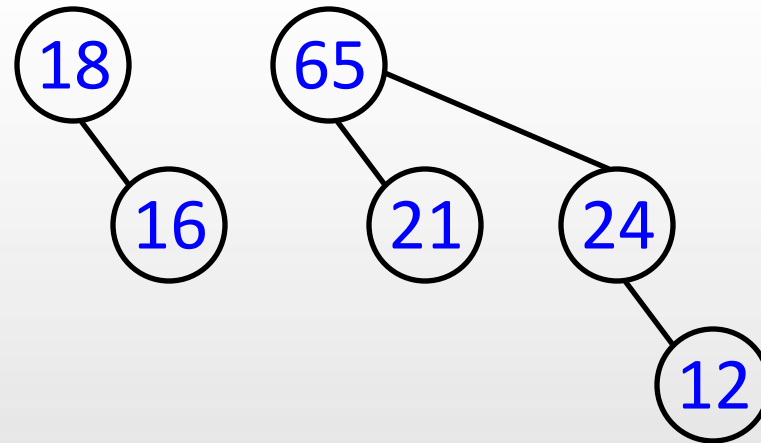


Binomial Queue Operations

- Maximum element – scan the roots of all trees
 $\approx O(\log n)$

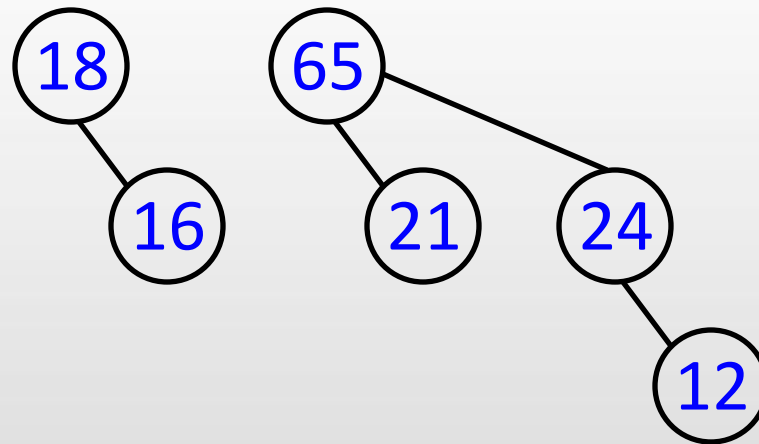


Binomial trees



Binomial trees

Priority Queue of size: 6 = 110

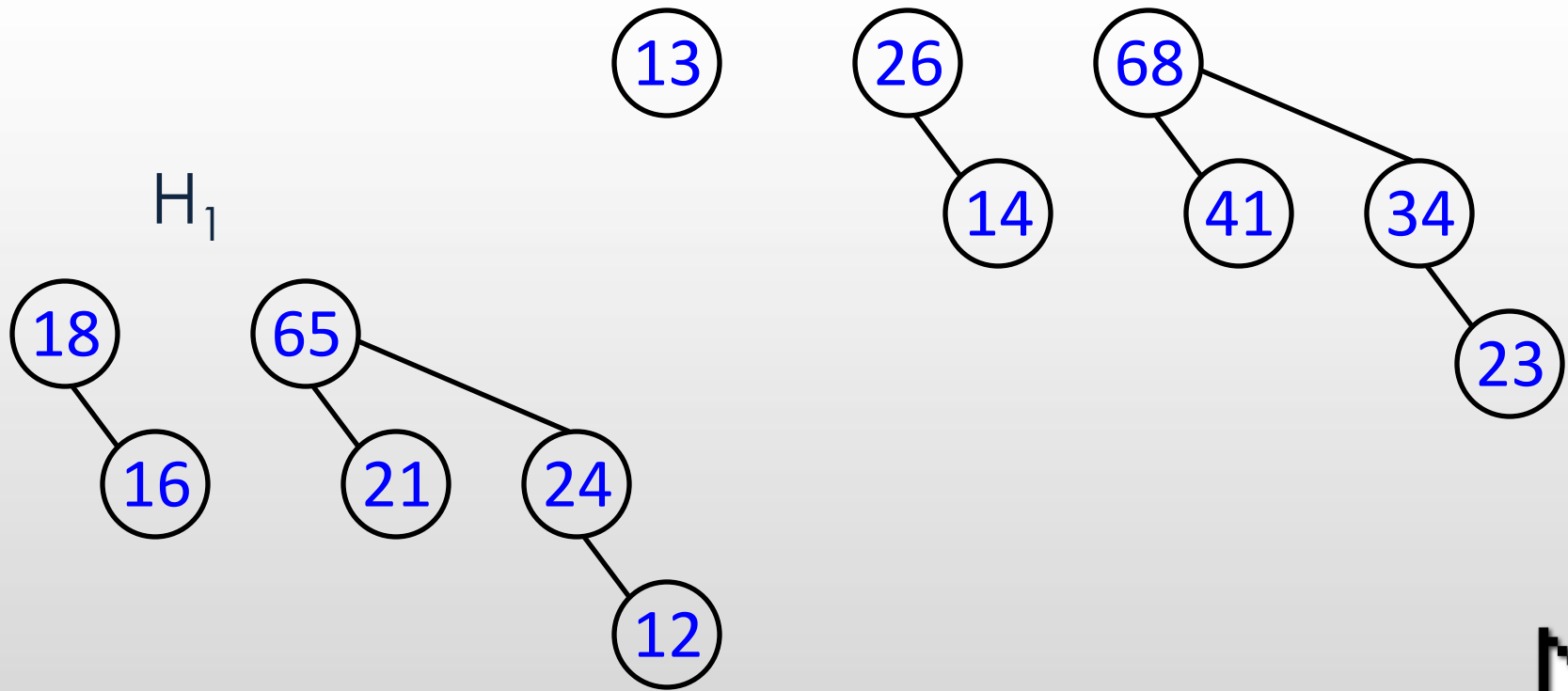


Binomial Queue Operations

- Maximum element – scan the roots of all trees
 $\approx O(\log n)$
- Merging two binomial queues $\approx O(\log n)$



Binomial trees



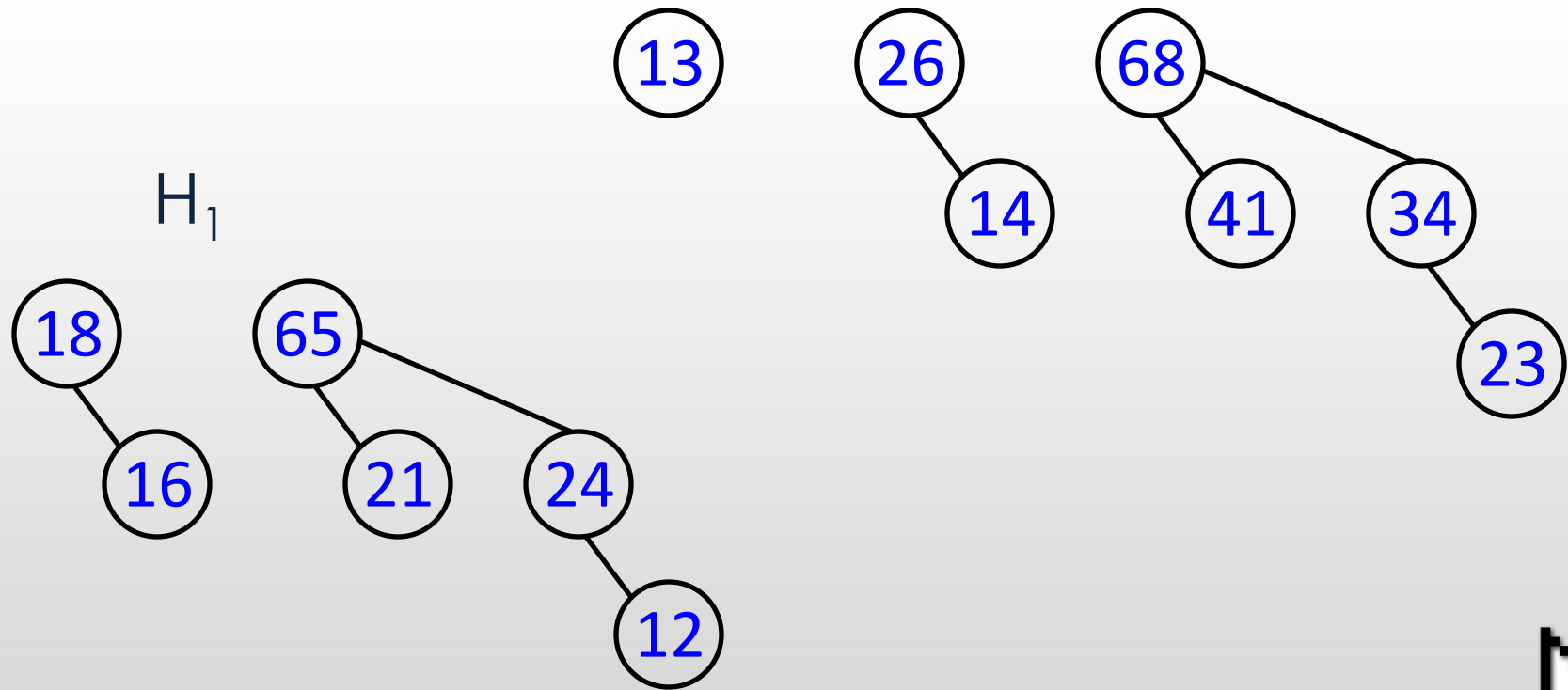
Binomial trees

H_3

13

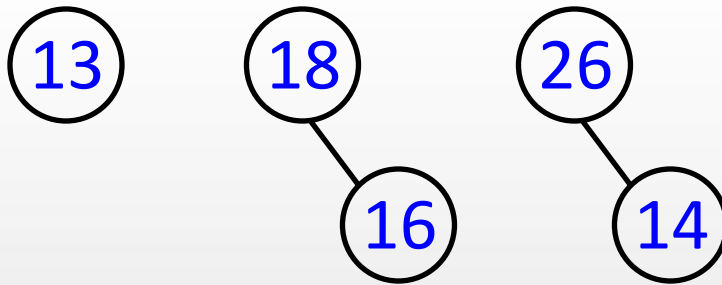


Binomial trees



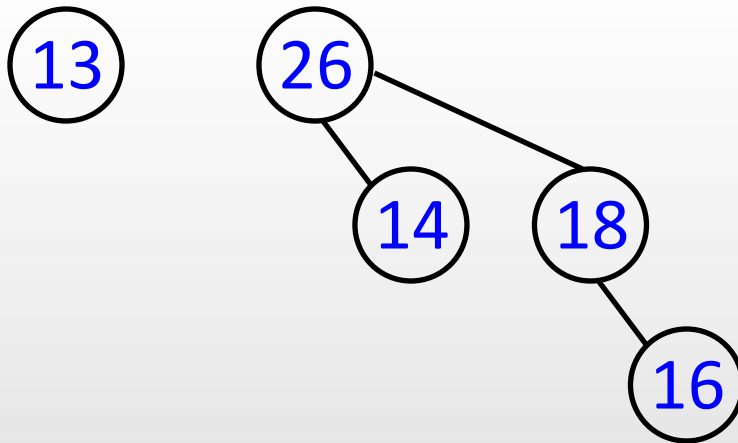
Binomial trees

H_3

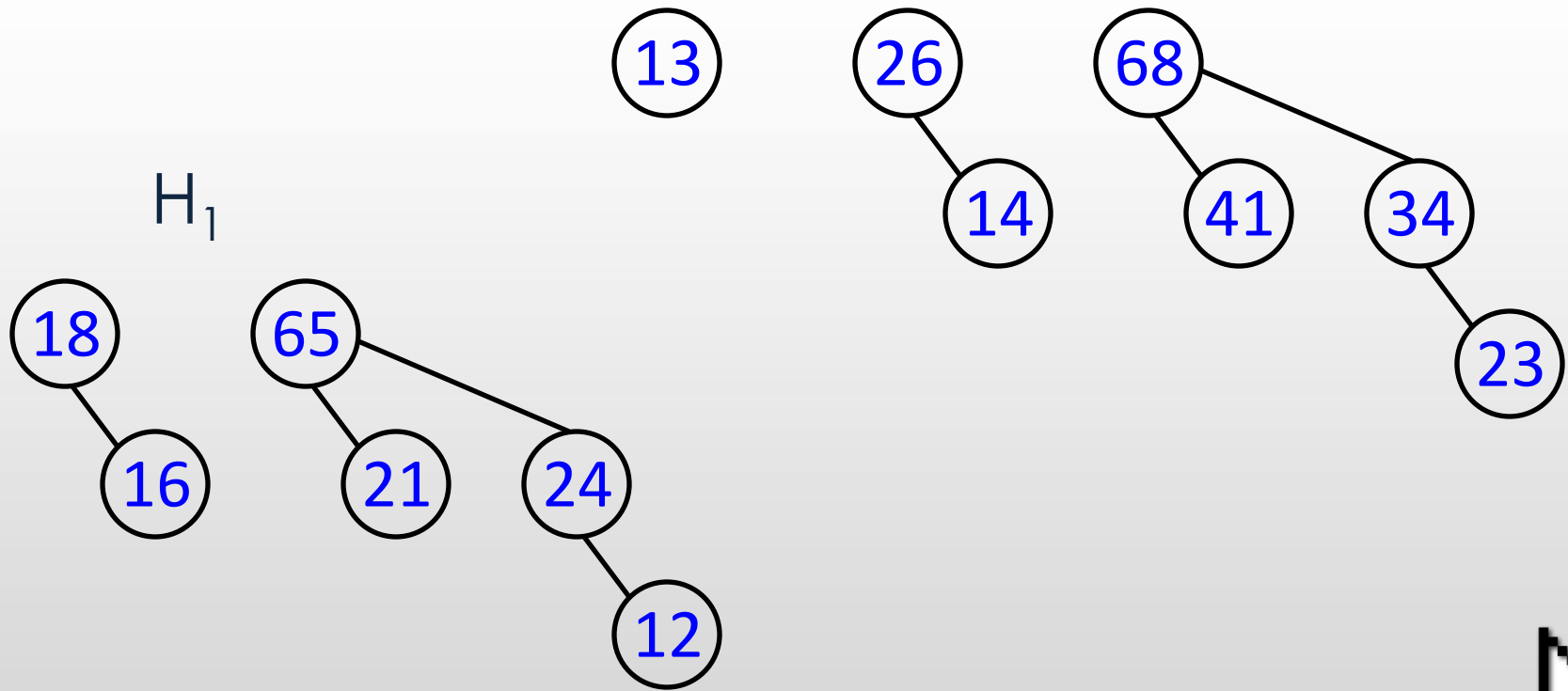


Binomial trees

H_3

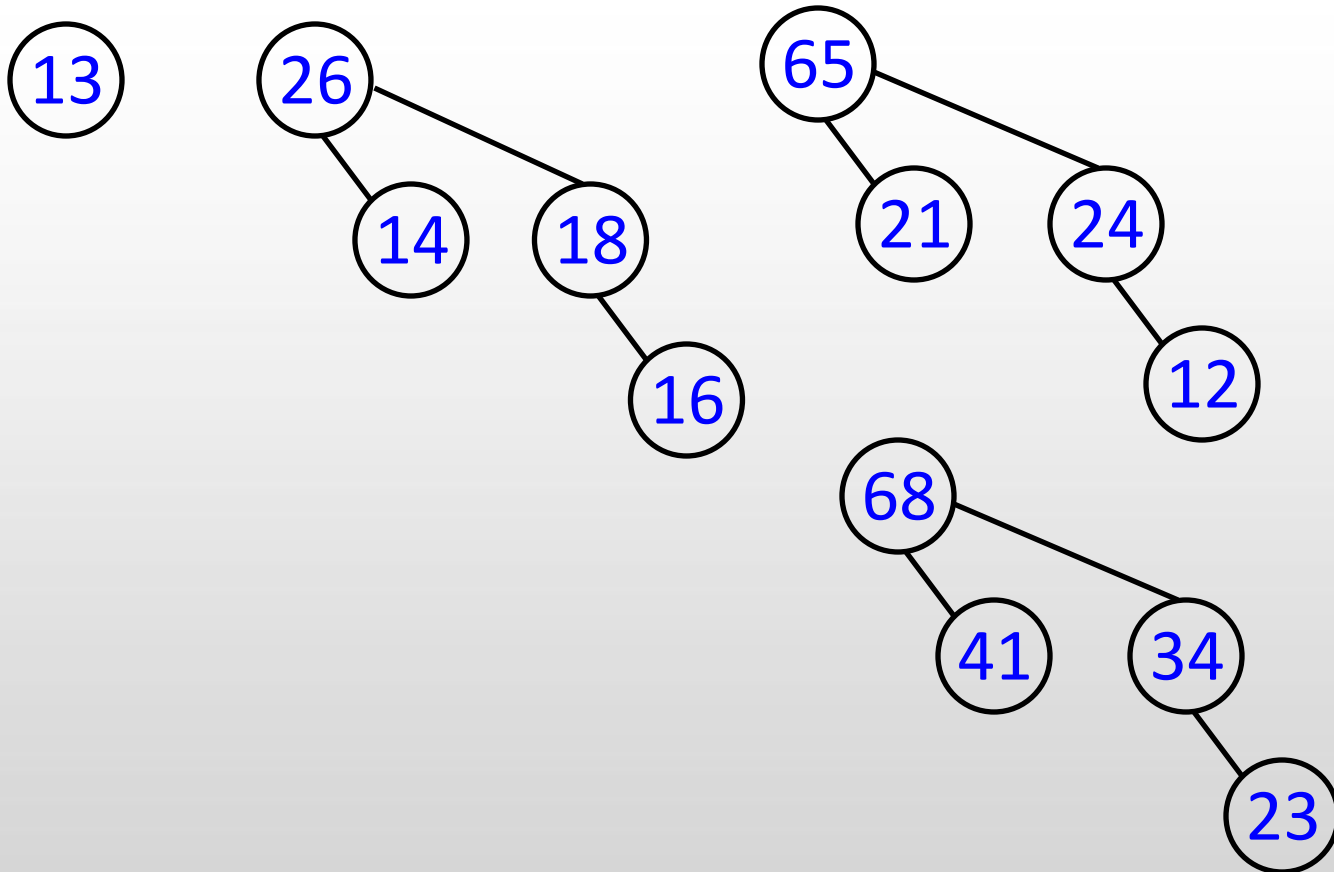


Binomial trees



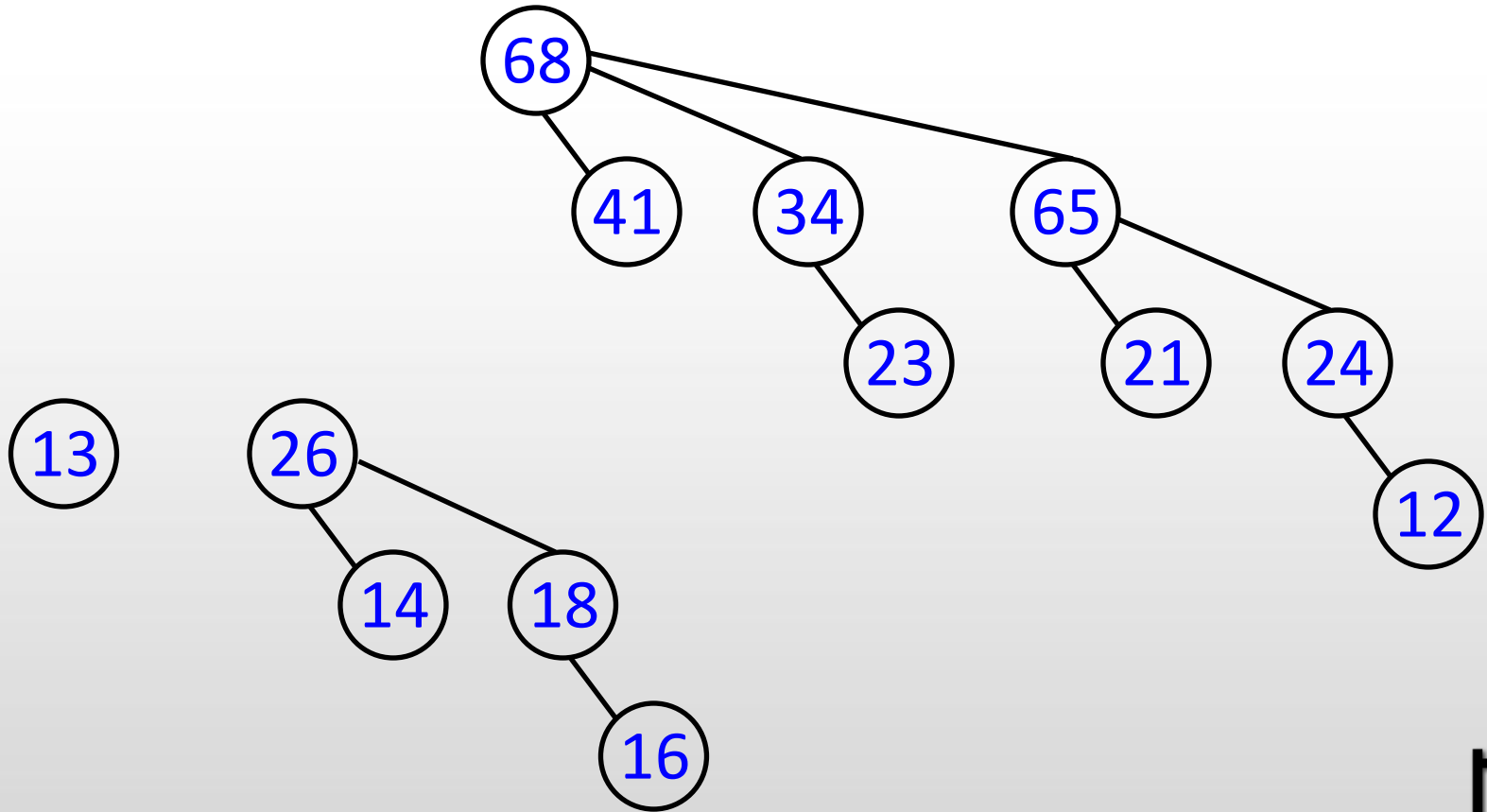
Binomial trees

H_3



Binomial trees

H_3



Binomial Queue Operations

- Maximum element – scan the roots of all trees
 $\approx O(\log n)$
- Merging two binomial queues $\approx O(\log n)$
- Insertion – creates one-node tree and merge
 $\approx O(\log n)$



Binomial trees

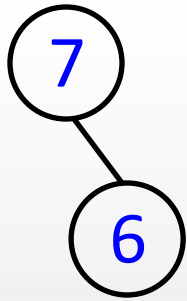
7



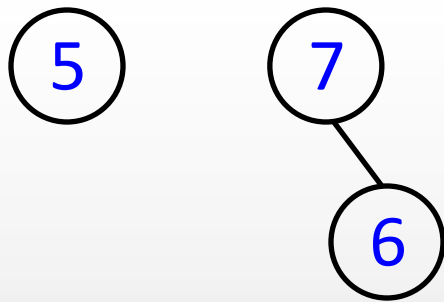
Binomial trees



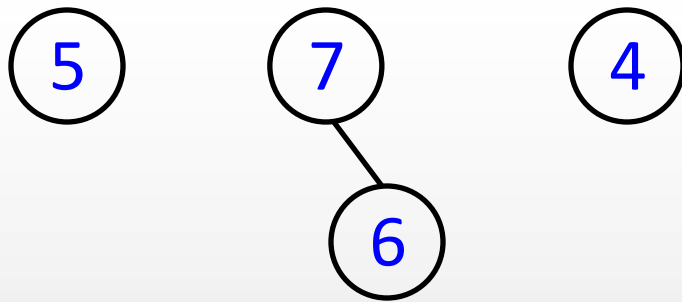
Binomial trees



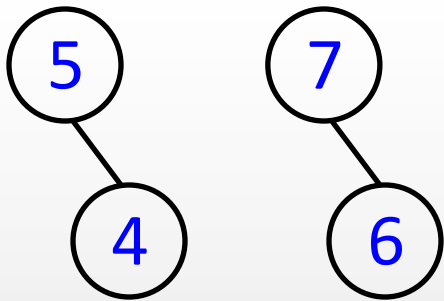
Binomial trees



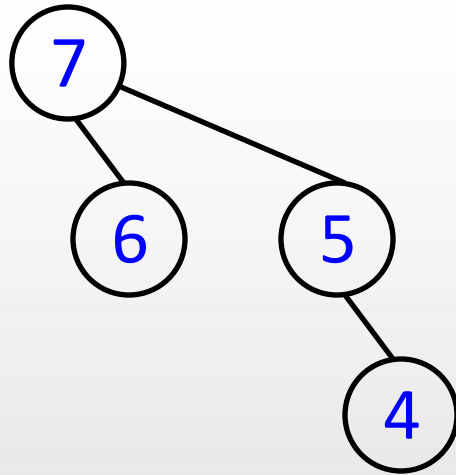
Binomial trees



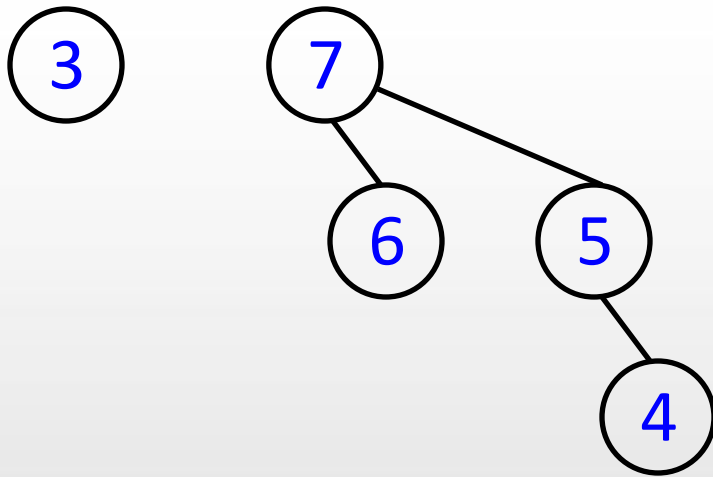
Binomial trees



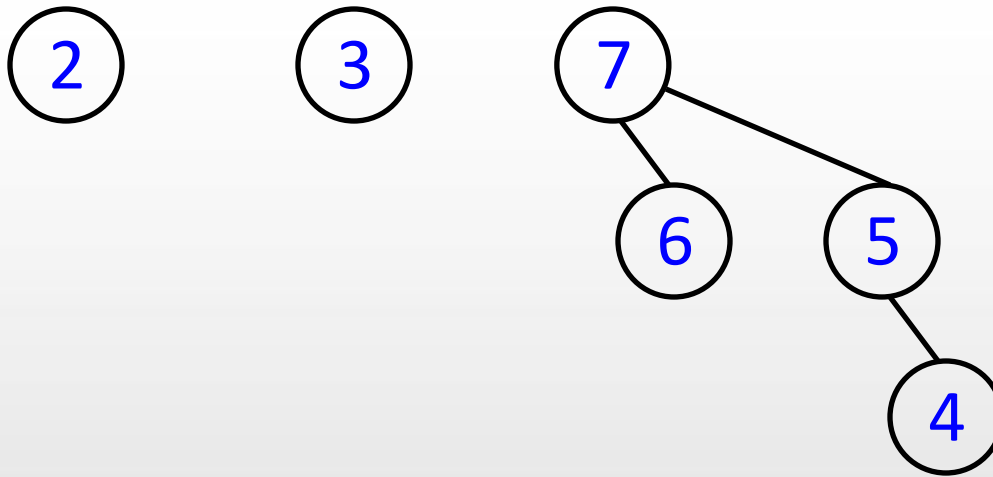
Binomial trees



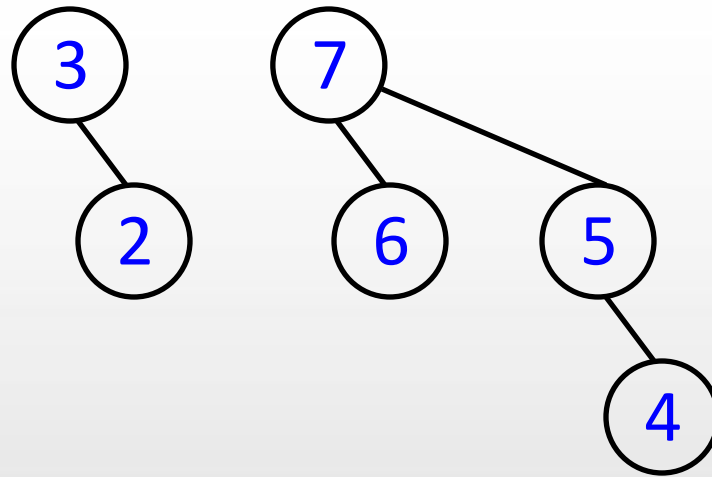
Binomial trees



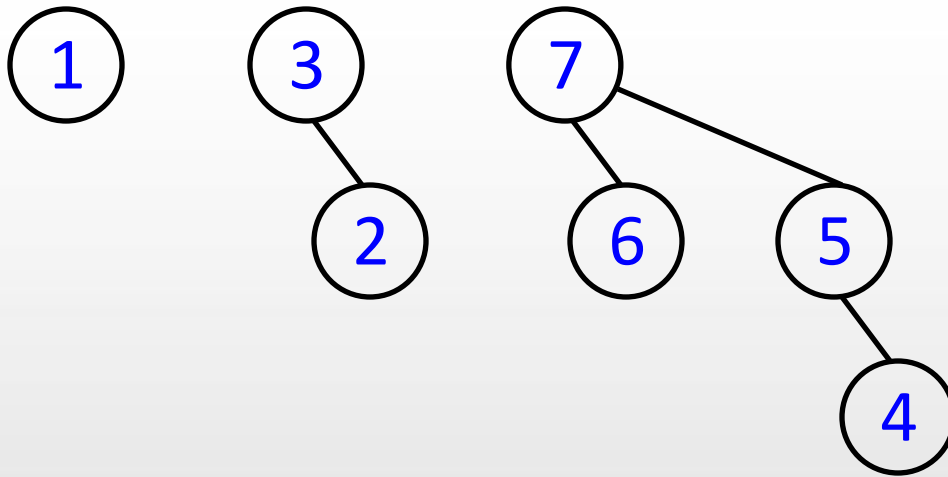
Binomial trees



Binomial trees



Binomial trees



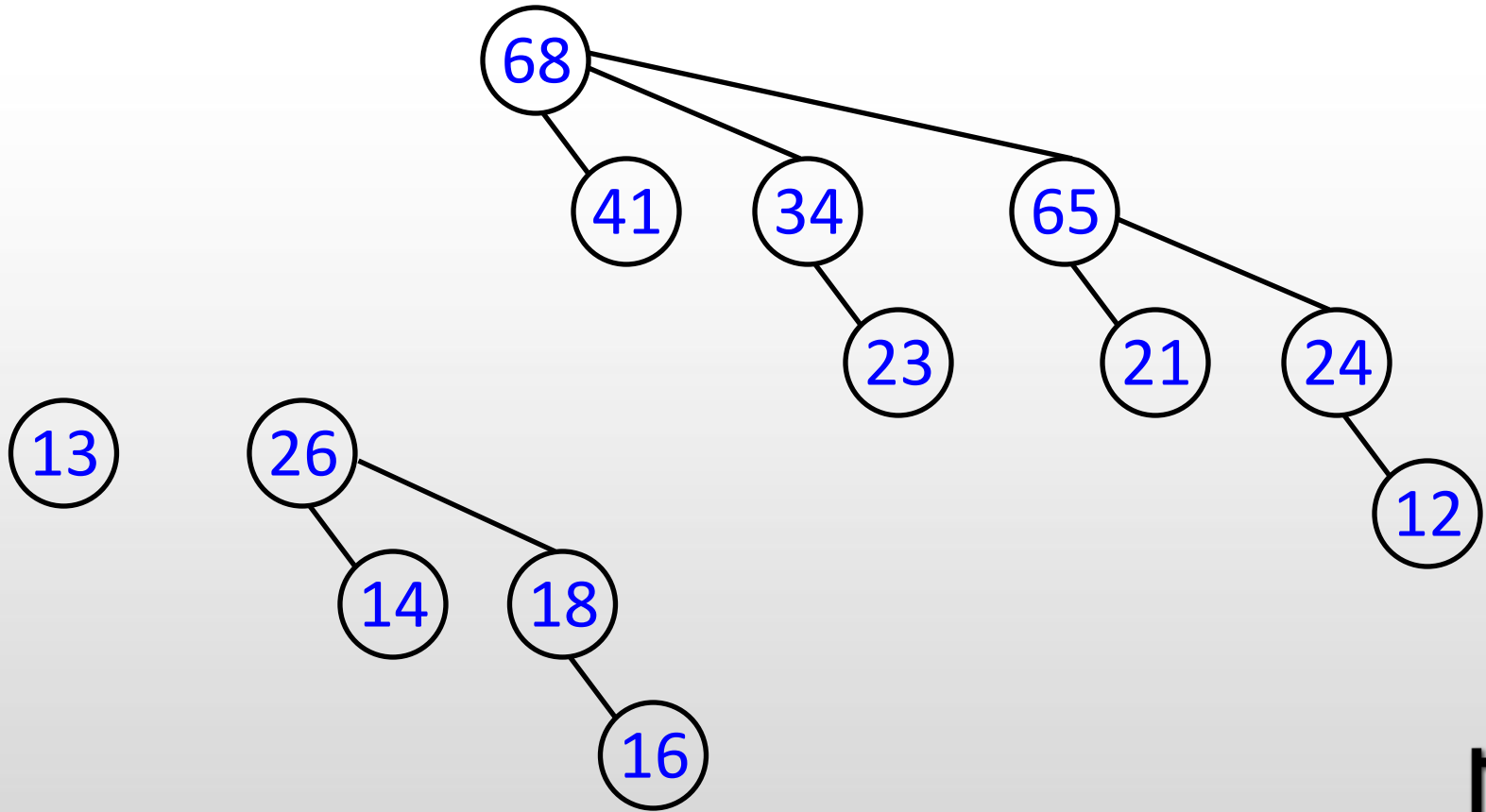
Binomial Queue Operations

- Maximum element – scan the roots of all trees
 $\approx O(\log n)$
- Merging two binomial queues $\approx O(\log n)$
- Insertion – creates one-node tree and merge
 $\approx O(\log n)$
- Delete_max $\approx O(\log n)$



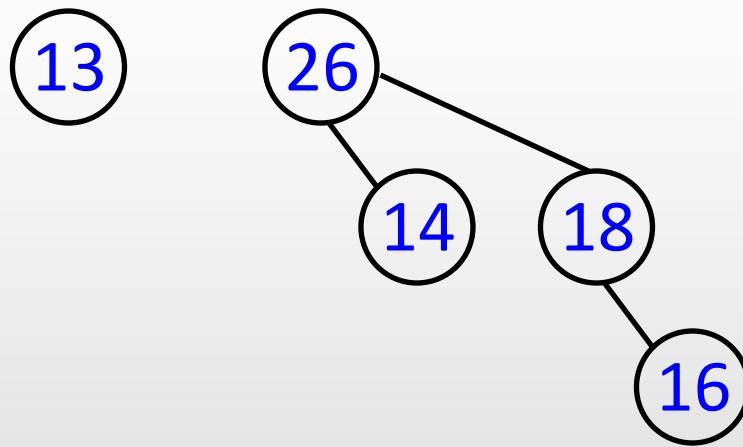
Binomial trees

H_3



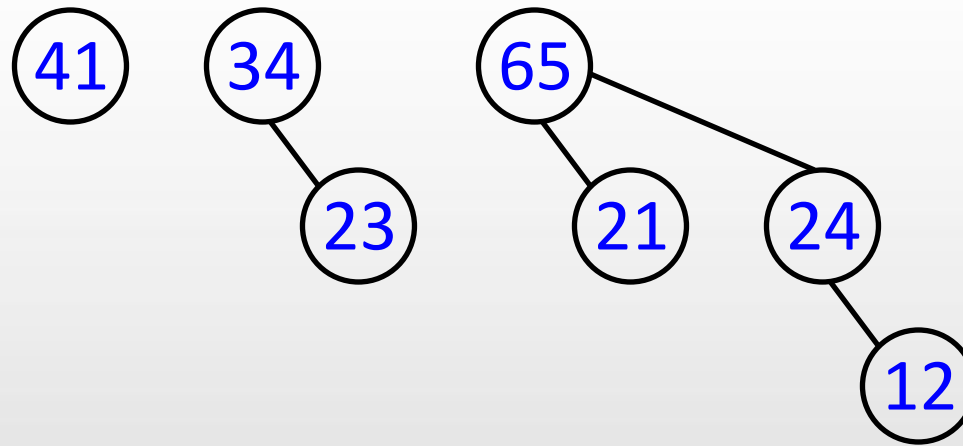
Binomial trees

H'



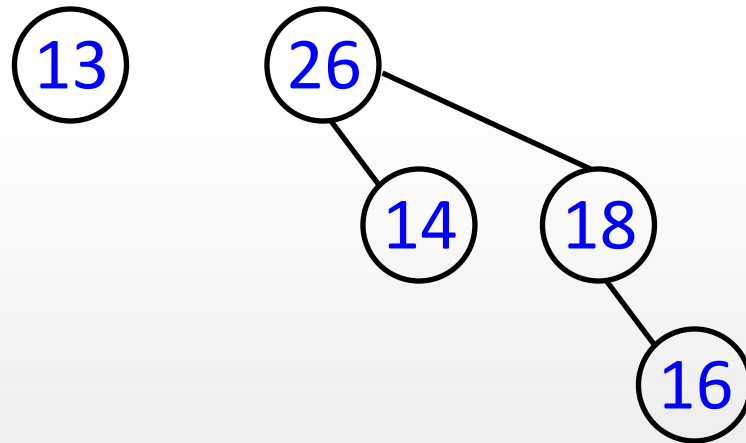
Binomial trees

H''

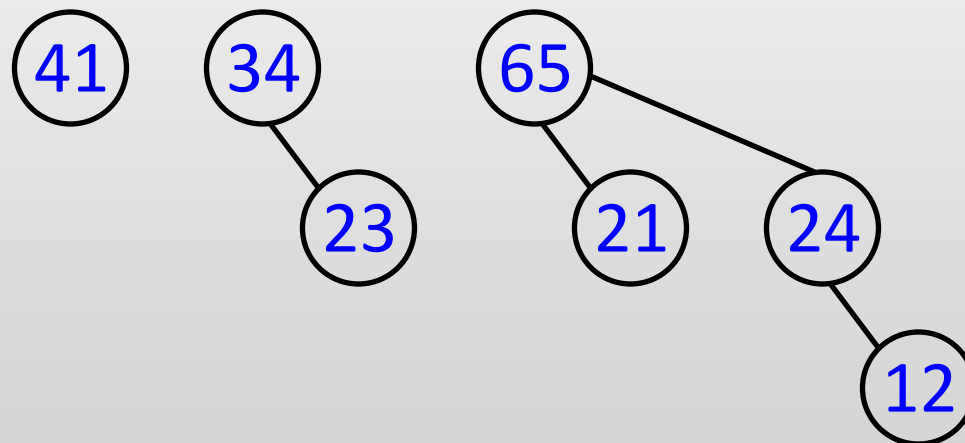


Binomial trees

H'

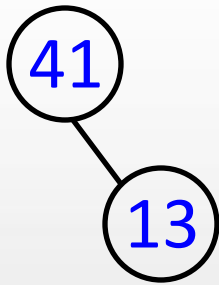


H''



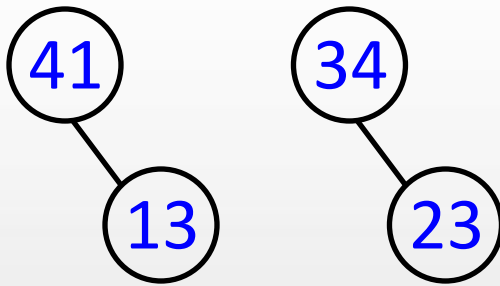
Binomial trees

H_3



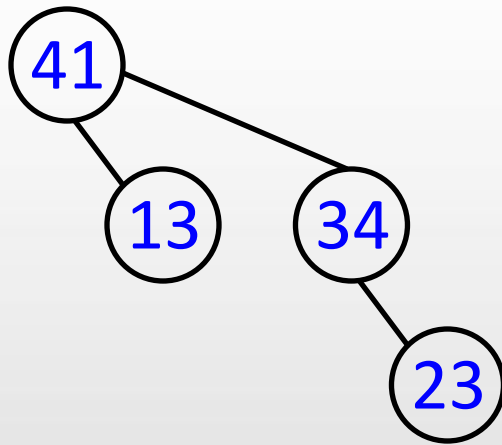
Binomial trees

H_3



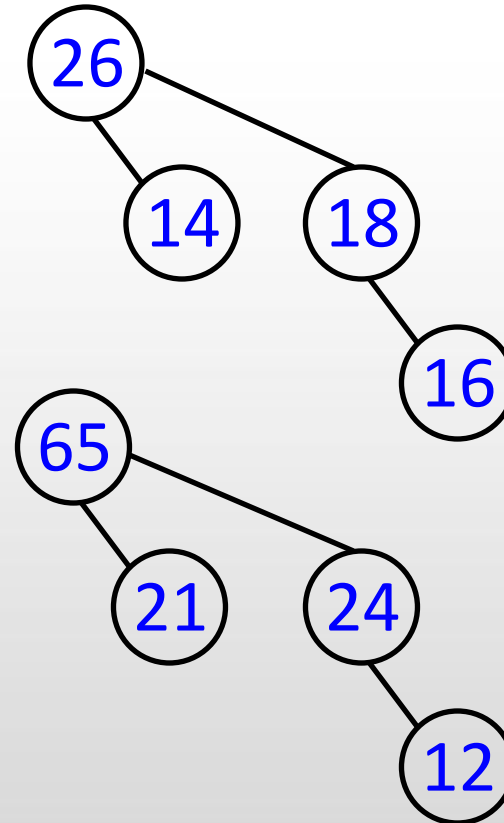
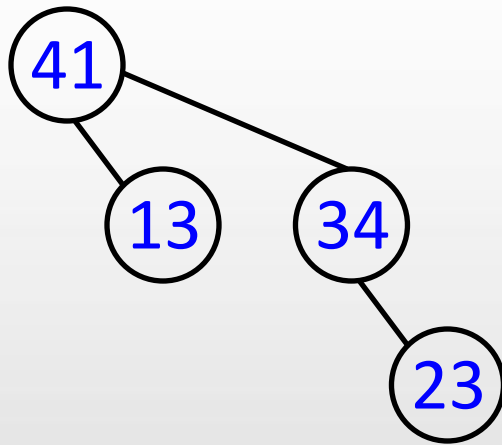
Binomial trees

H_3



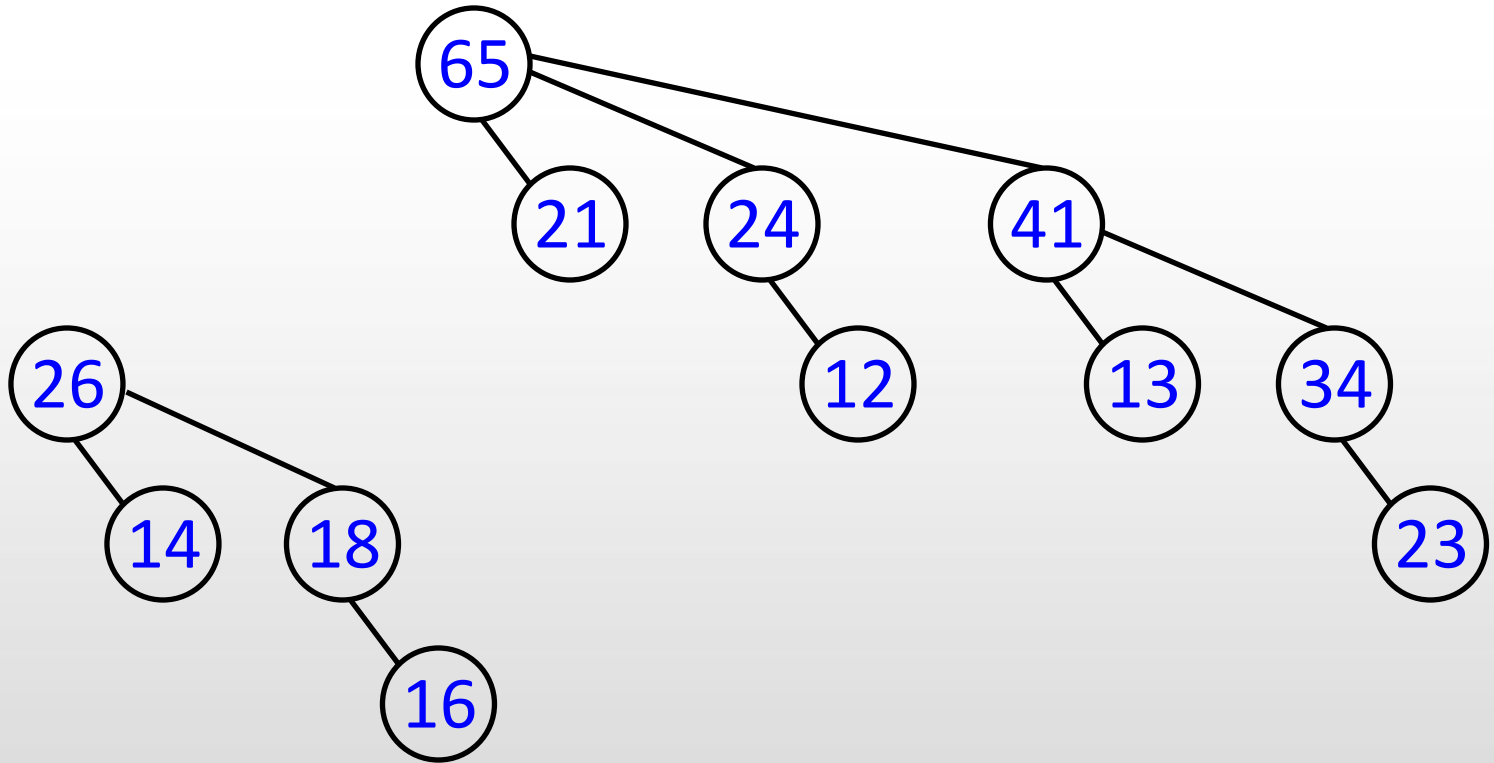
Binomial trees

H_3



Binomial trees

H_3



6. Heaps

Heapsort

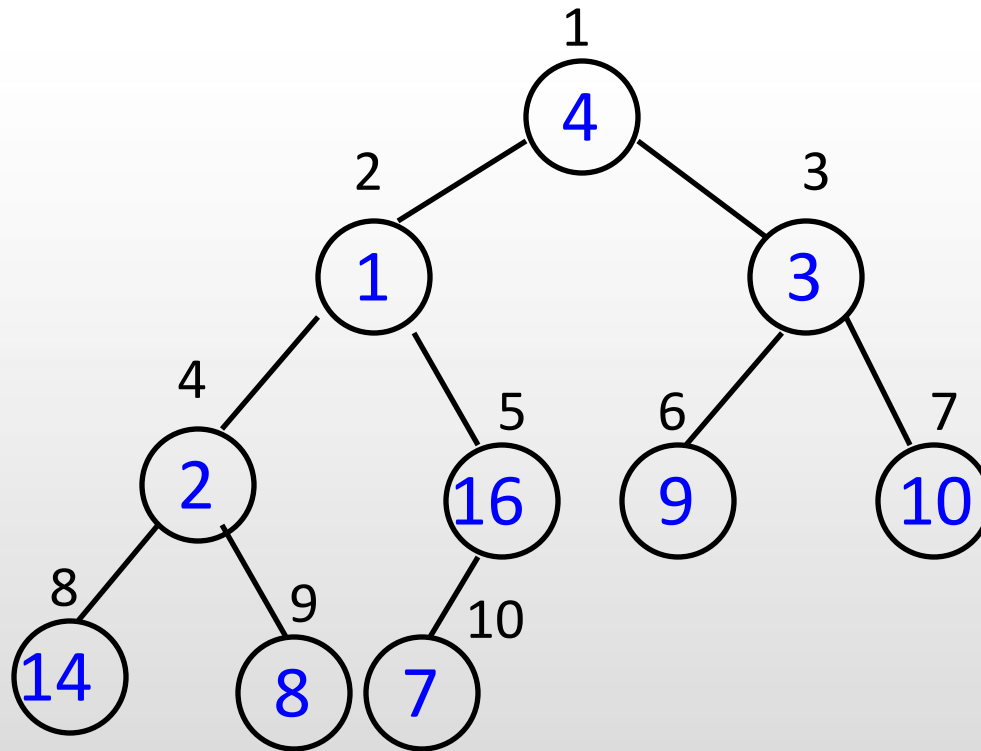


Heapsort

```
HeapSort(A,n)
begin
  BuildHeap(A)
  for i=n downto 2 do
    swap(A[1],A[i])
    Heapify(A,1,(i-1))
  end
```



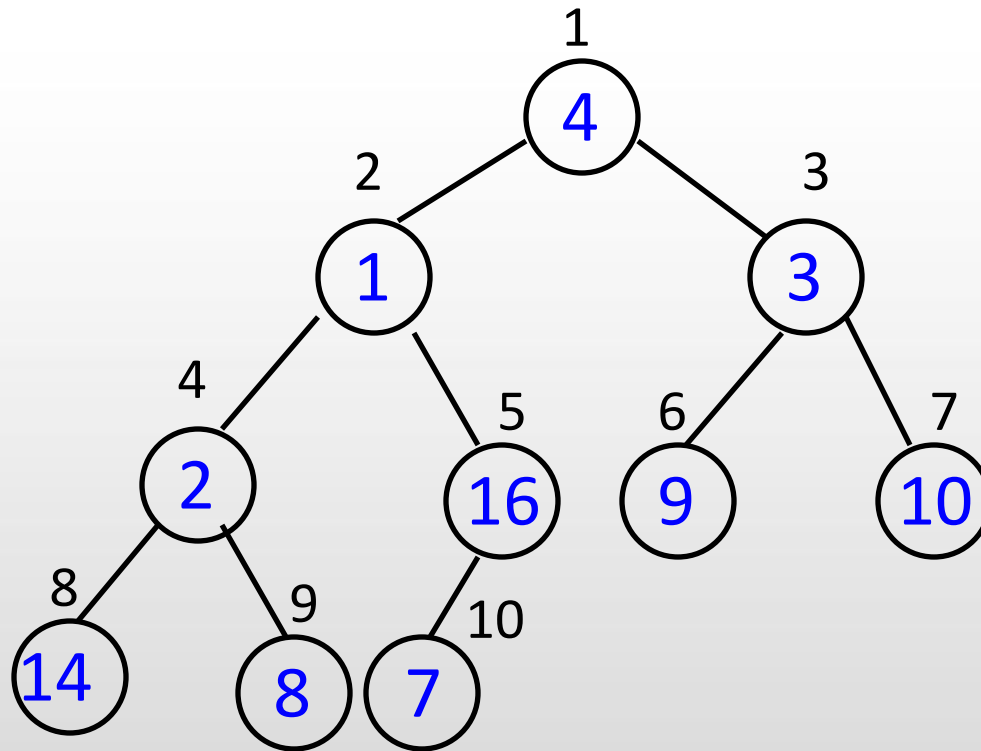
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



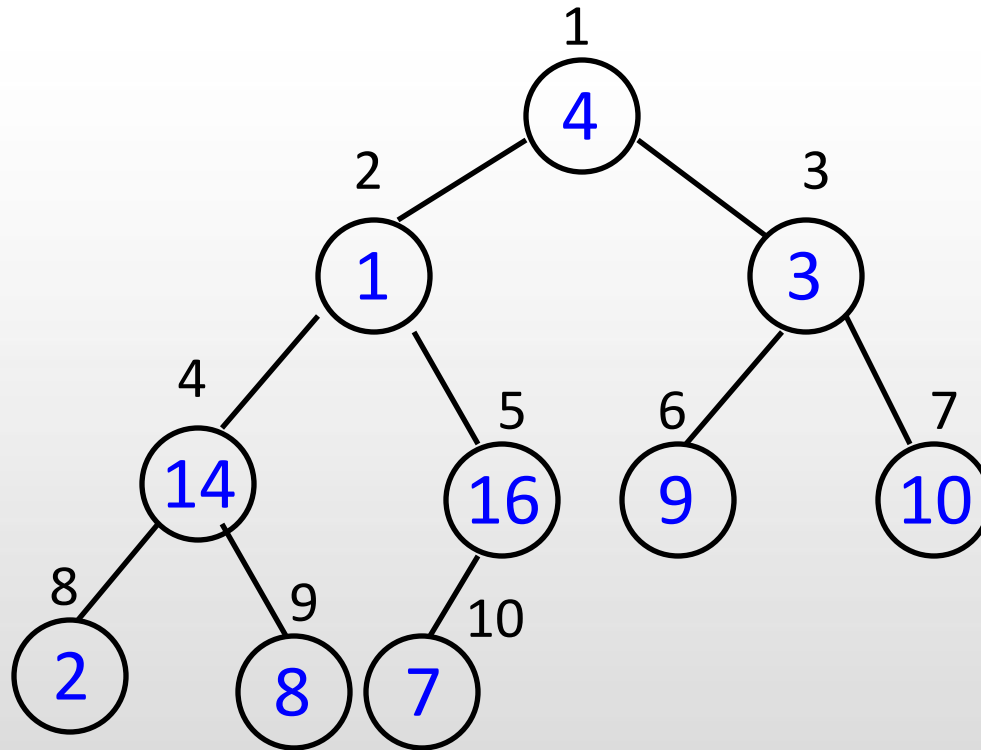
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



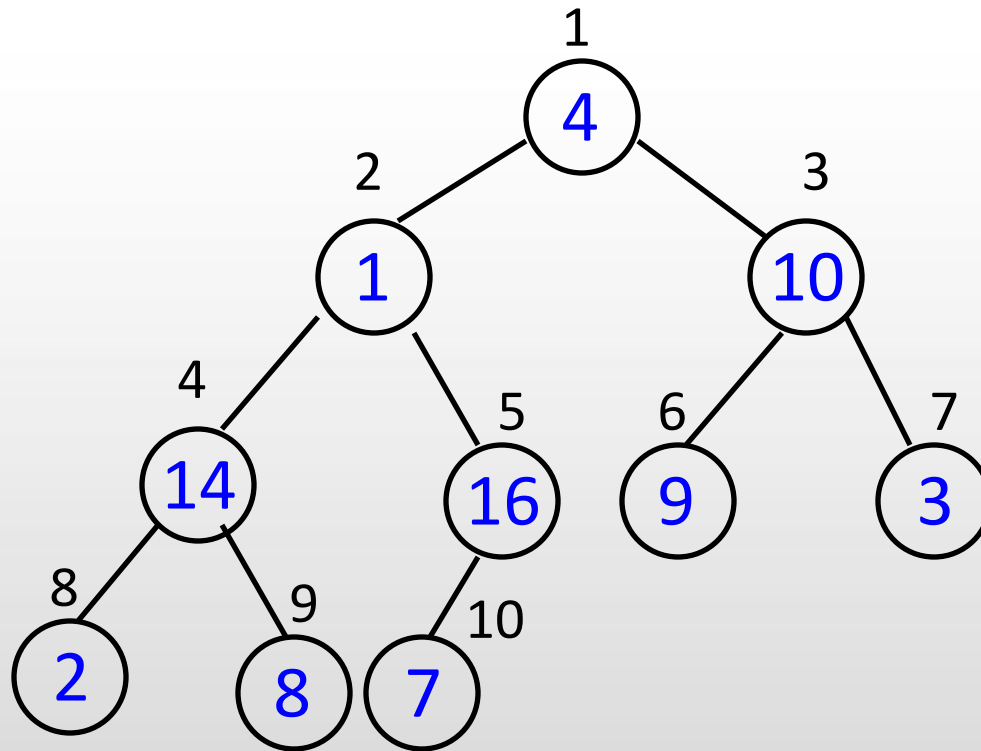
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



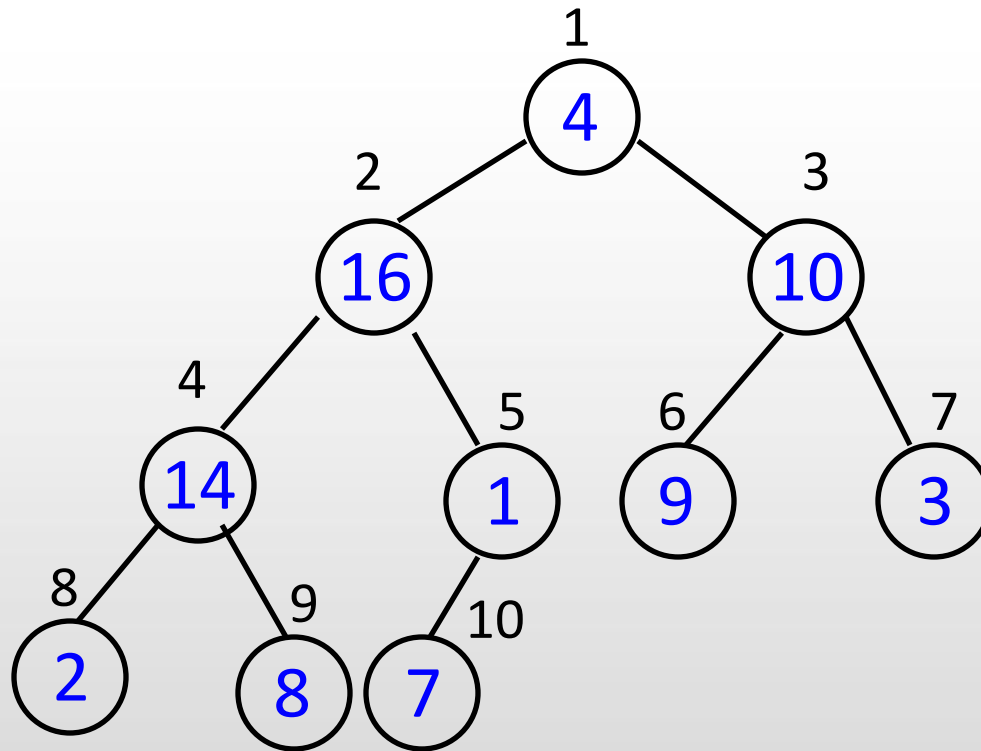
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



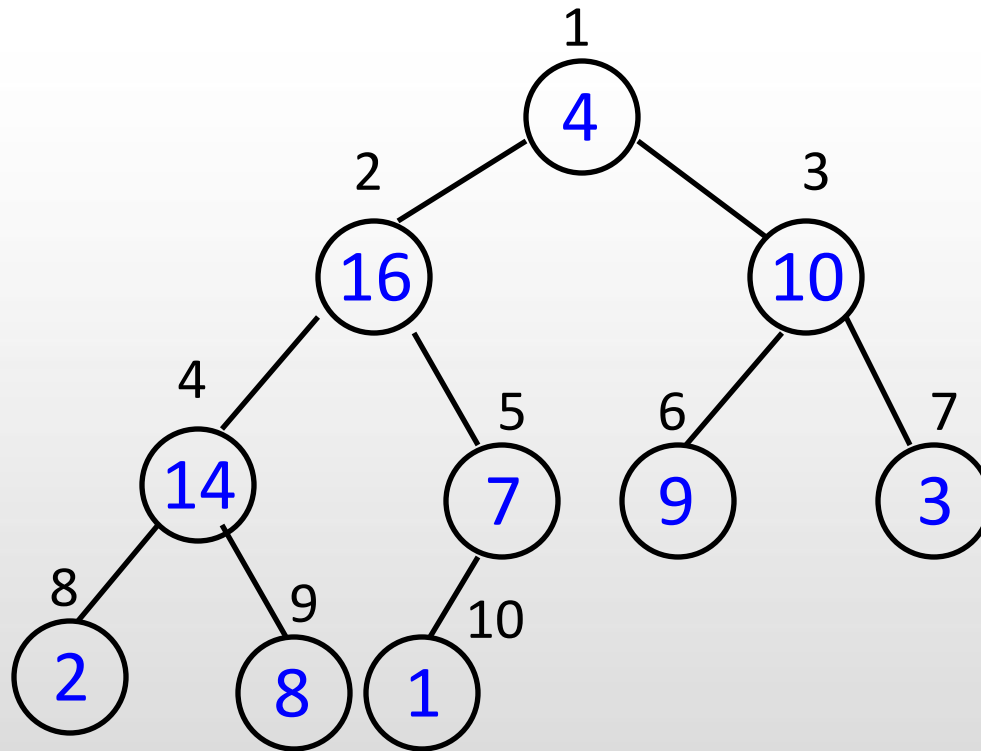
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



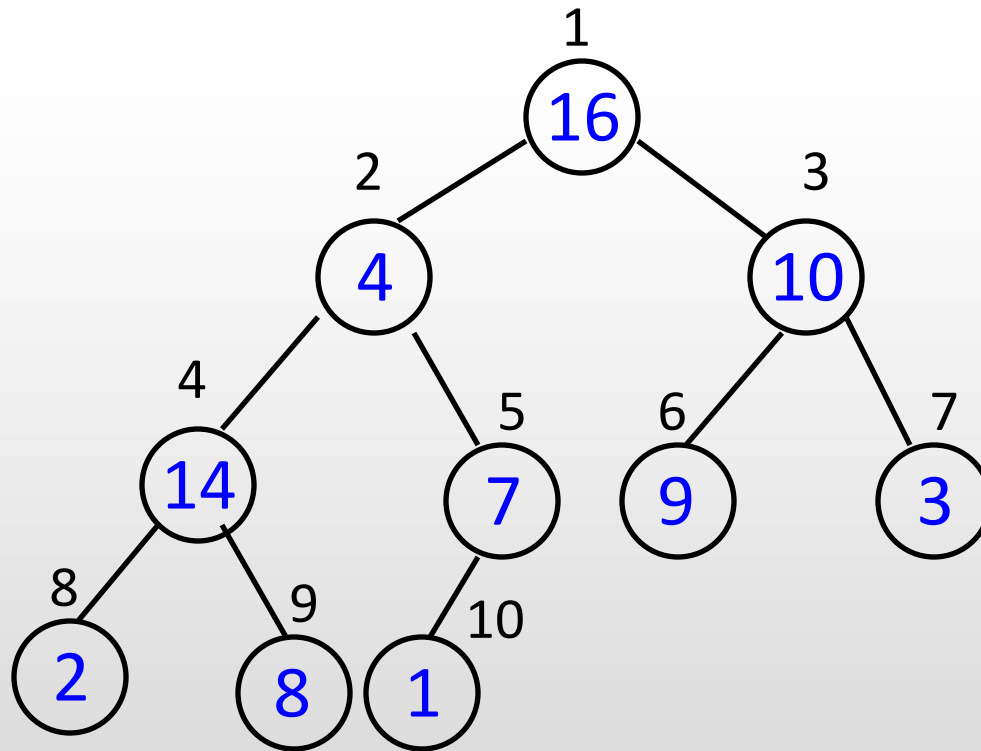
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



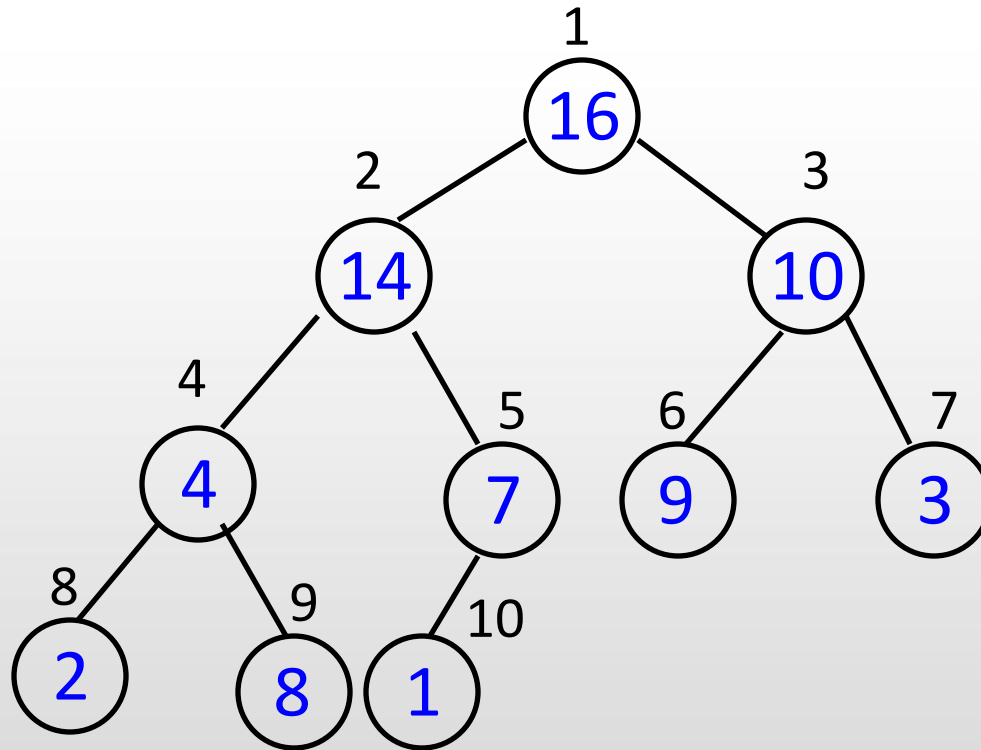
Sort 4,1,3,2,16,9,10,14,8,7



BUILDHEAP(A)



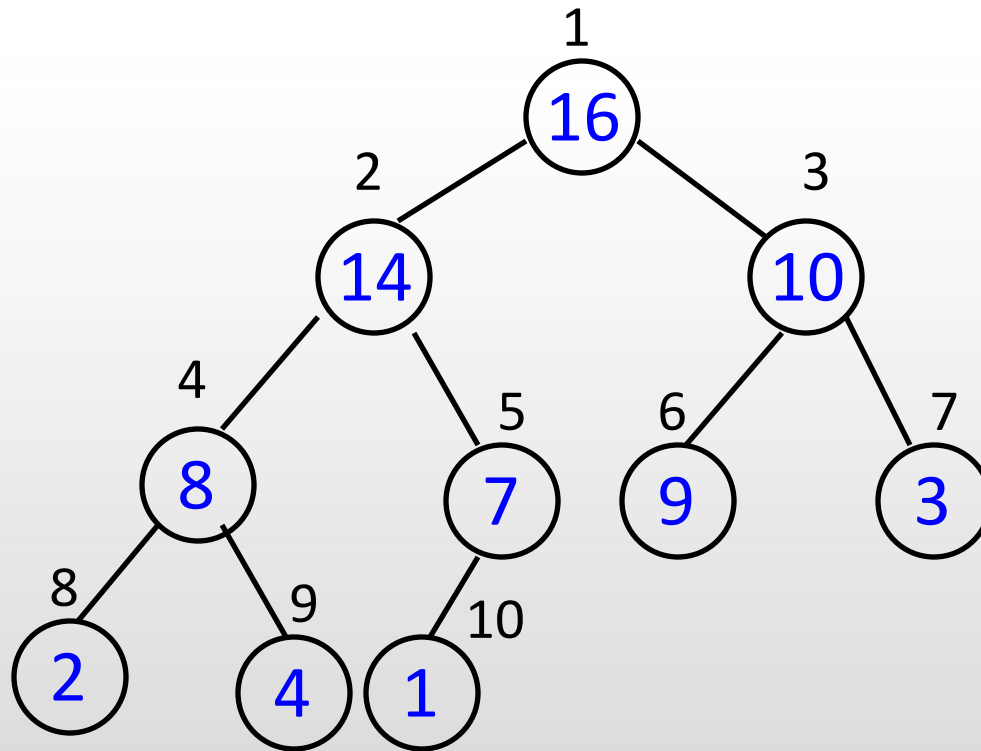
Sort 4,1,3,2,16,9,10,14,8,7



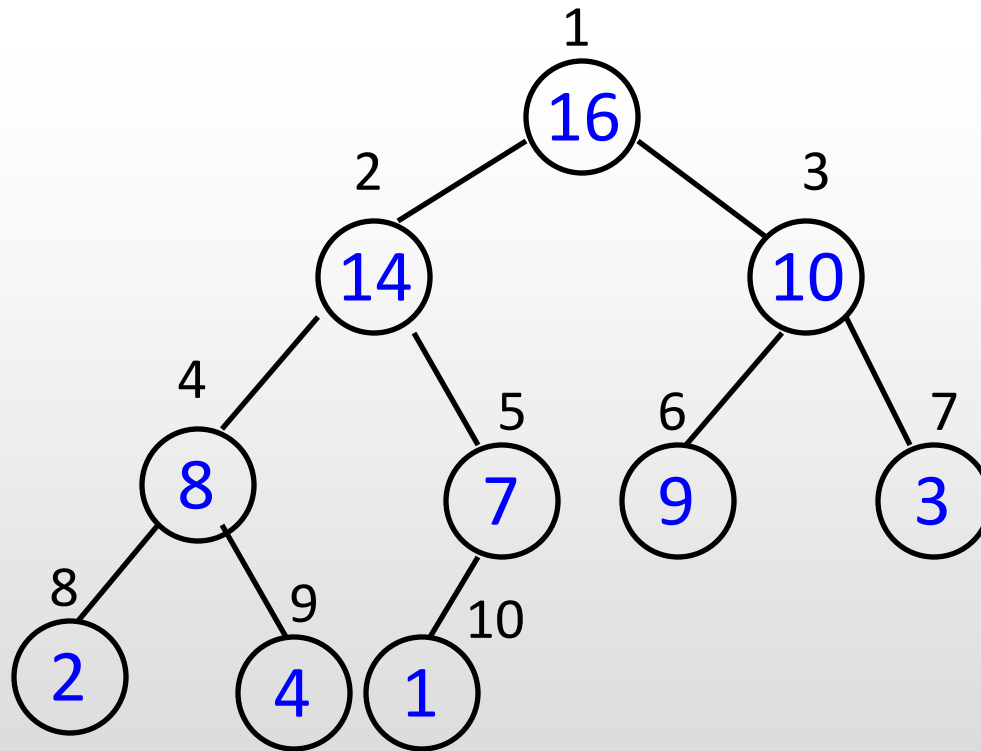
BUILDHEAP(A)



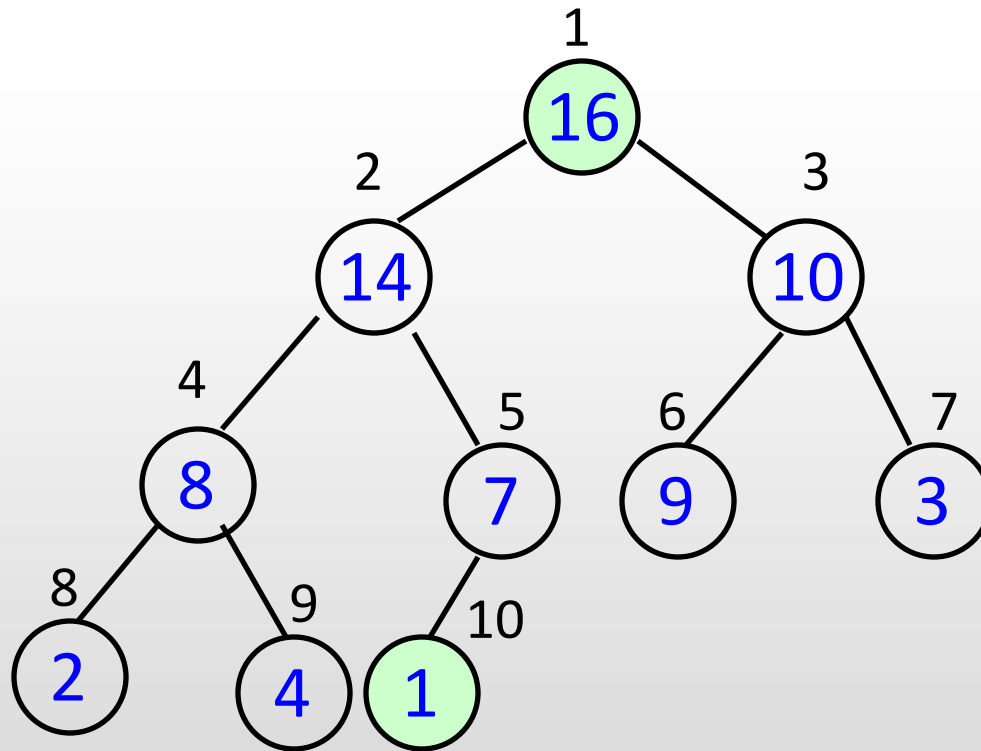
Resulting Max-Heap



1st pass: $i=10$



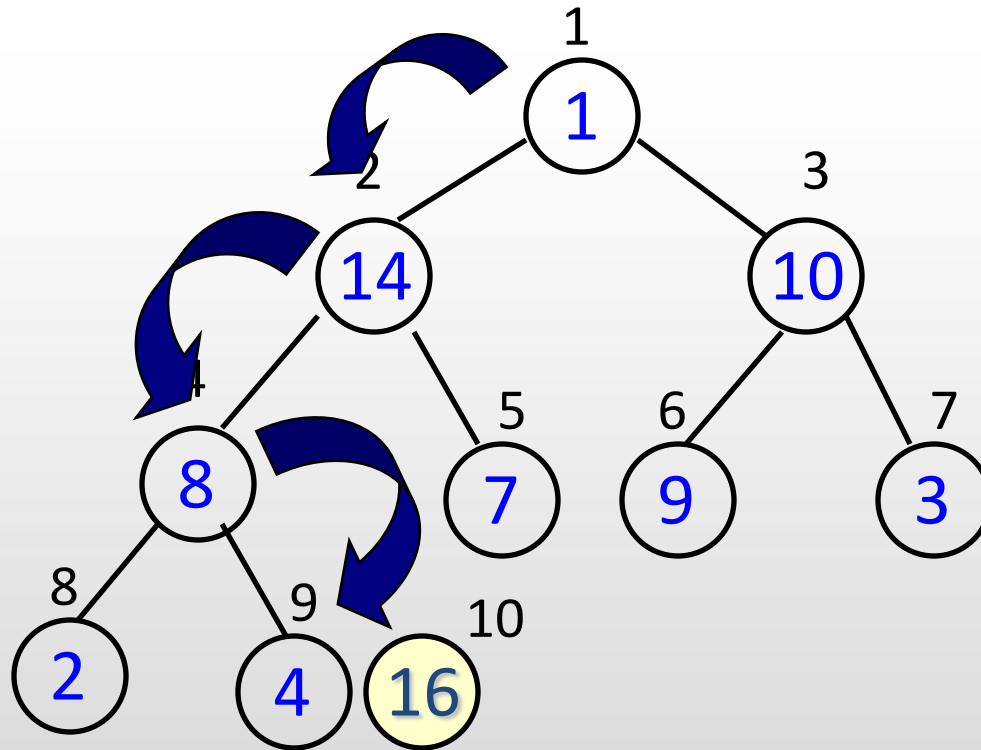
1st pass: $i=10$



`swap(A[1],A[i])`



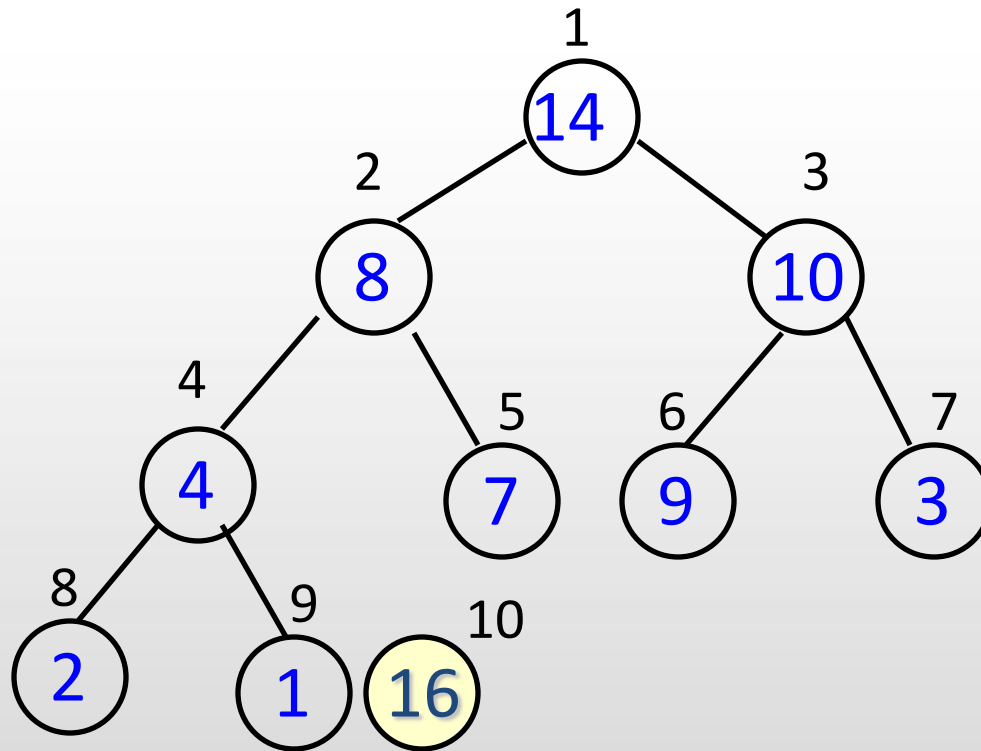
1st pass: $i=10$



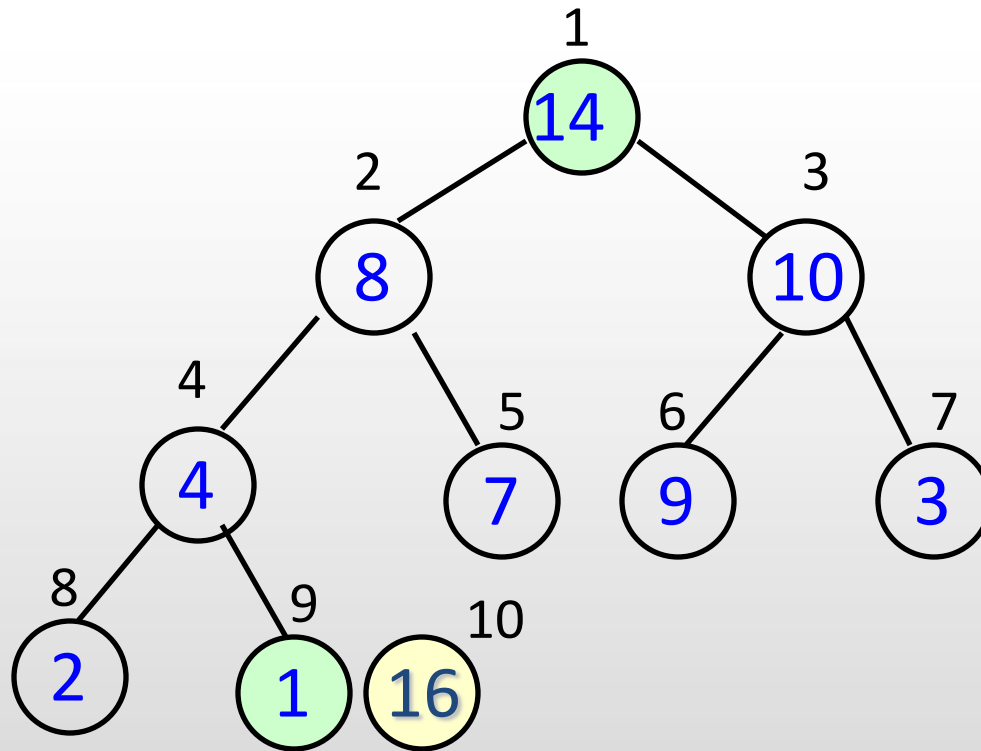
Heapify(A,1,9)



2nd pass: i=9



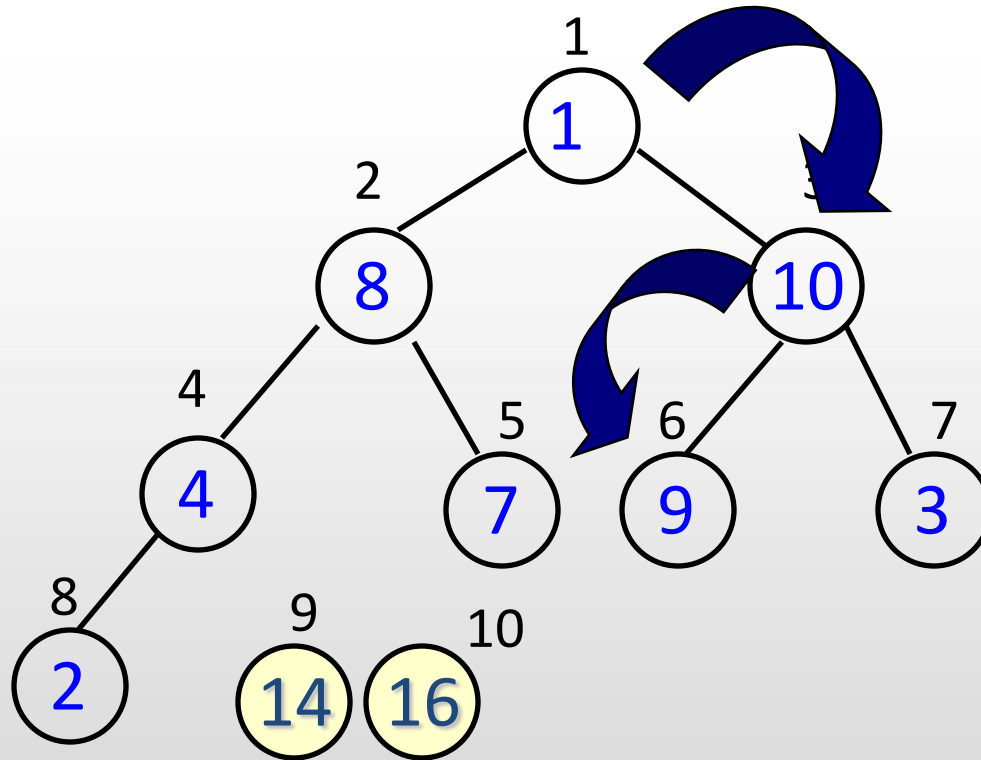
2nd pass: i=9



swap(A[1],A[9])



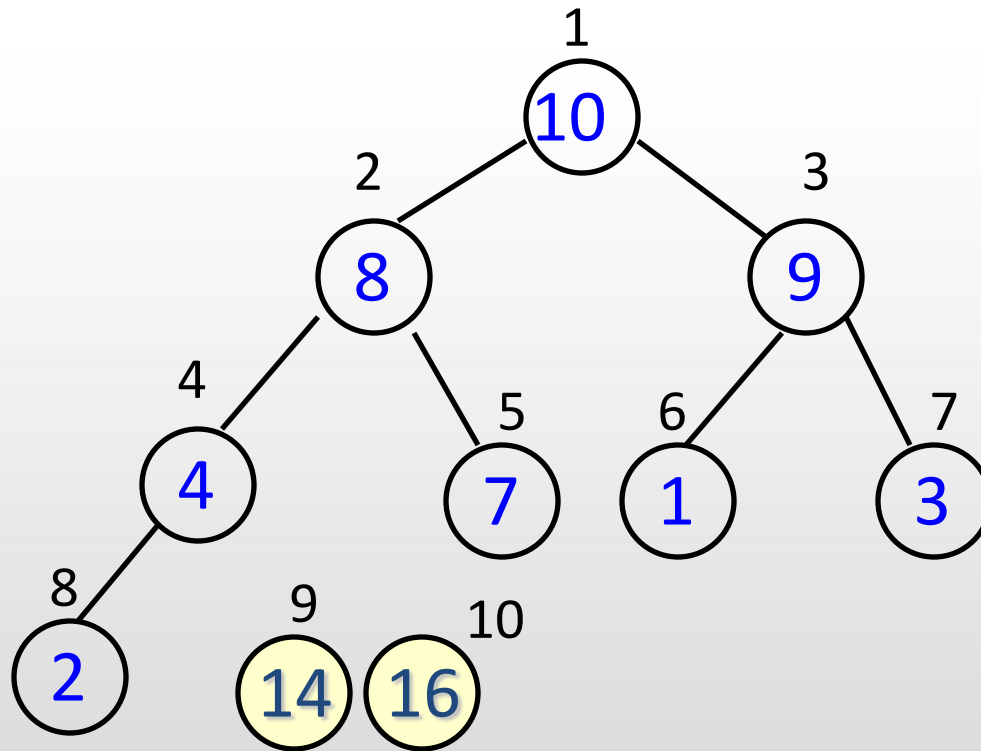
2nd pass: $i=9$



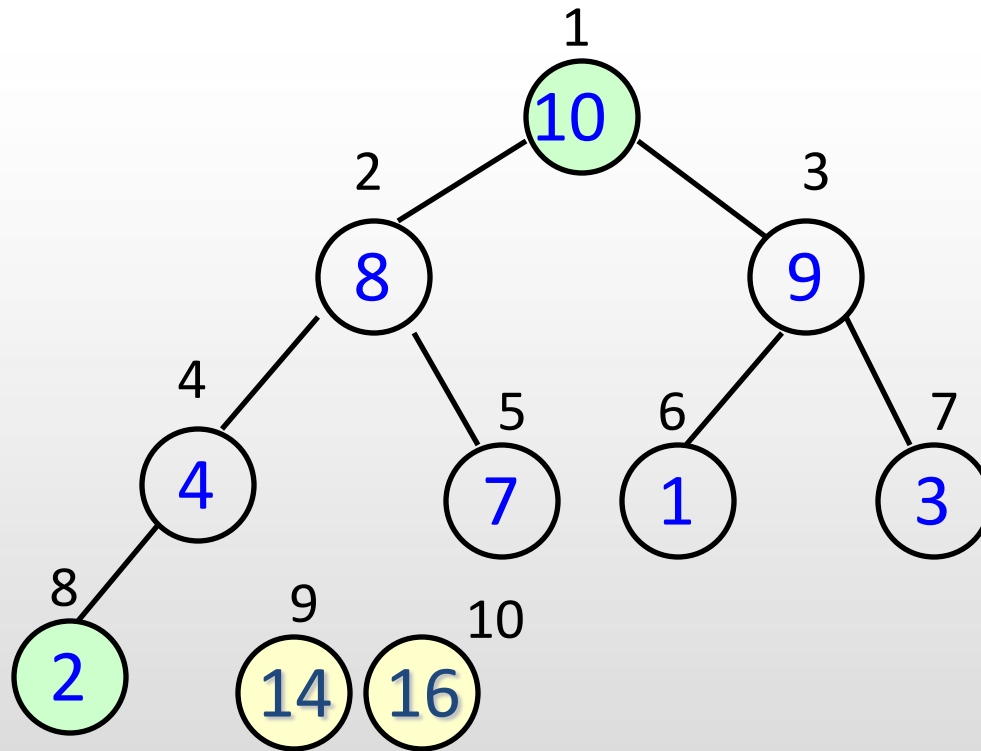
Heapify(A,1,8)



3rd pass: $i=8$



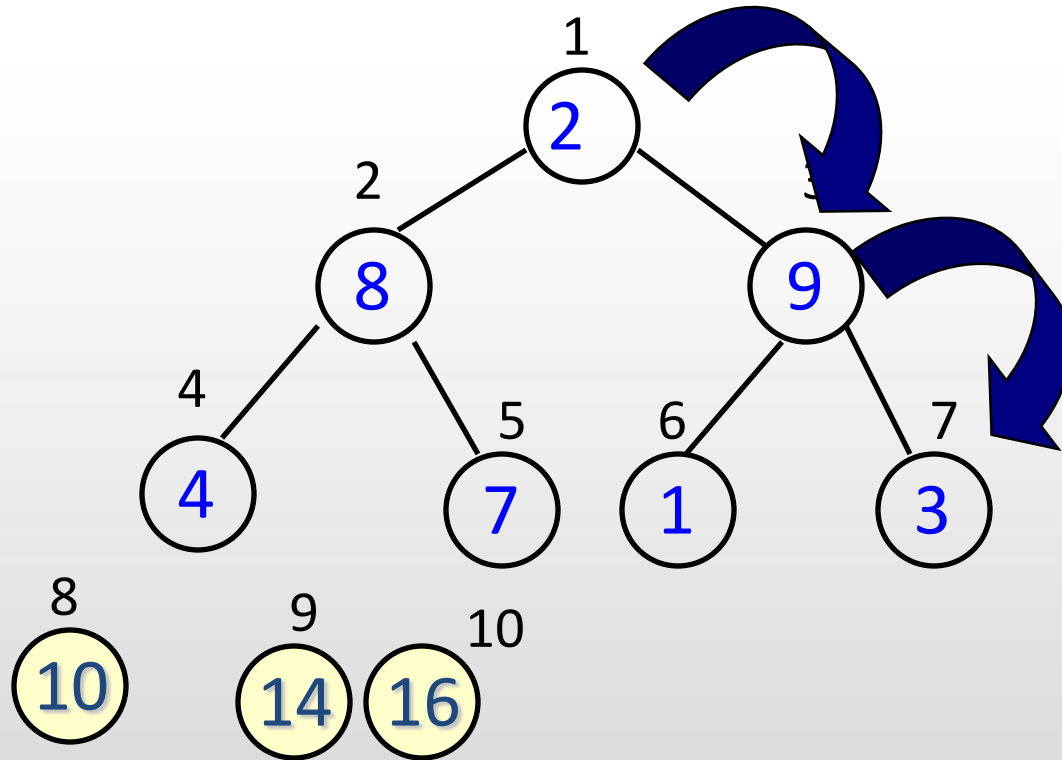
3rd pass: i=8



swap(A[1],A[8])



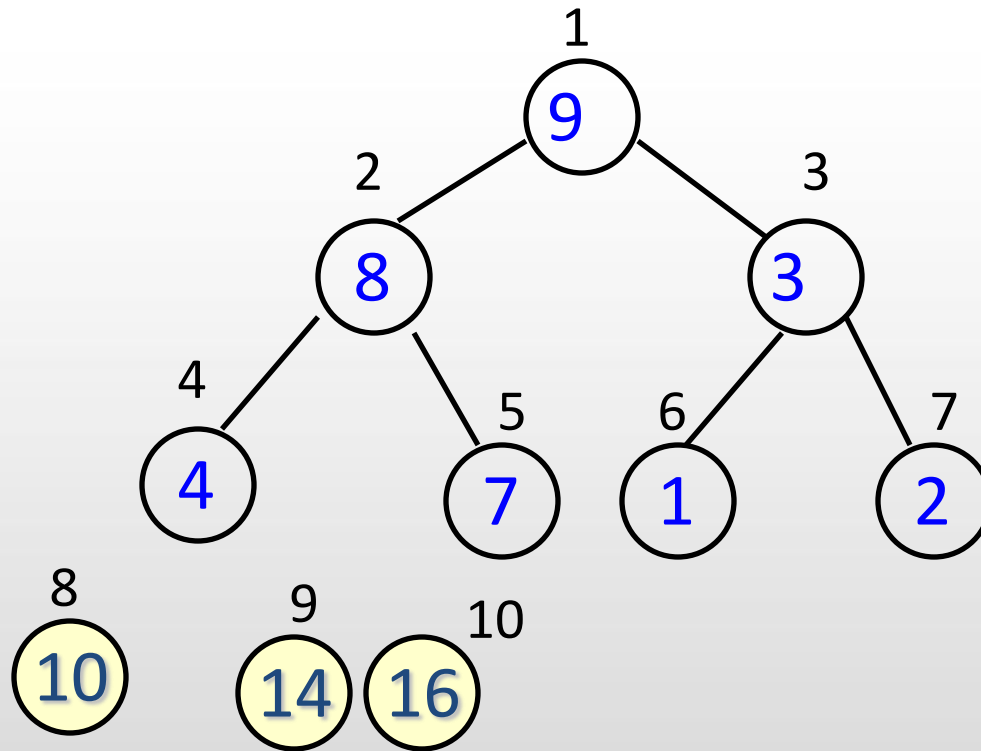
3rd pass: $i=8$



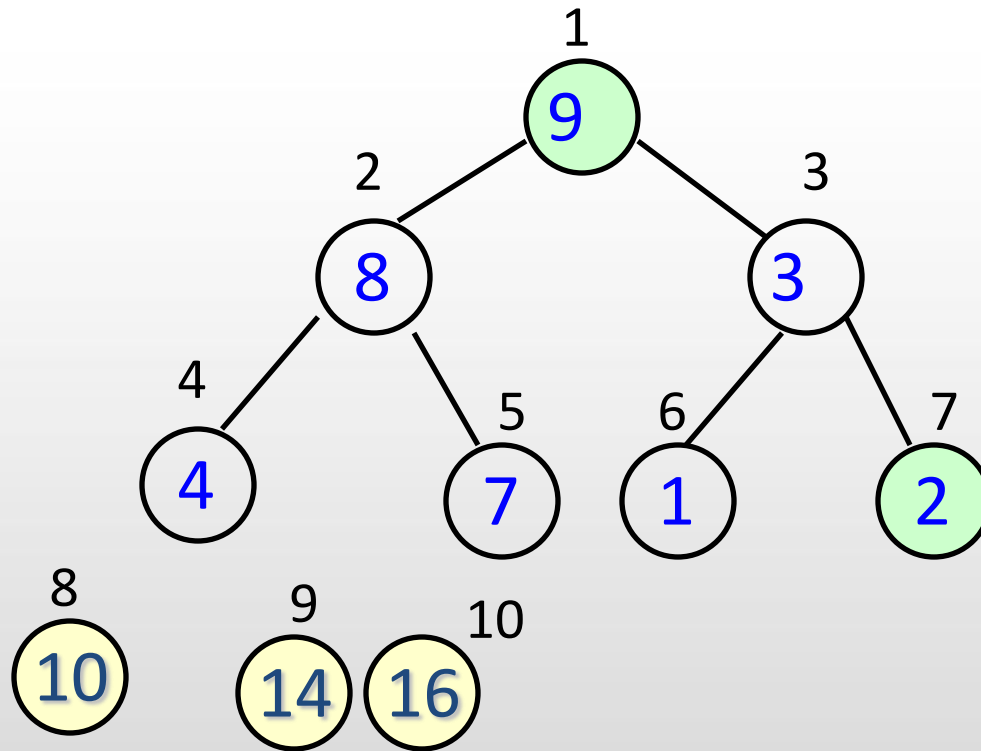
Heapify(A,1,7)



4th pass: $i=7$



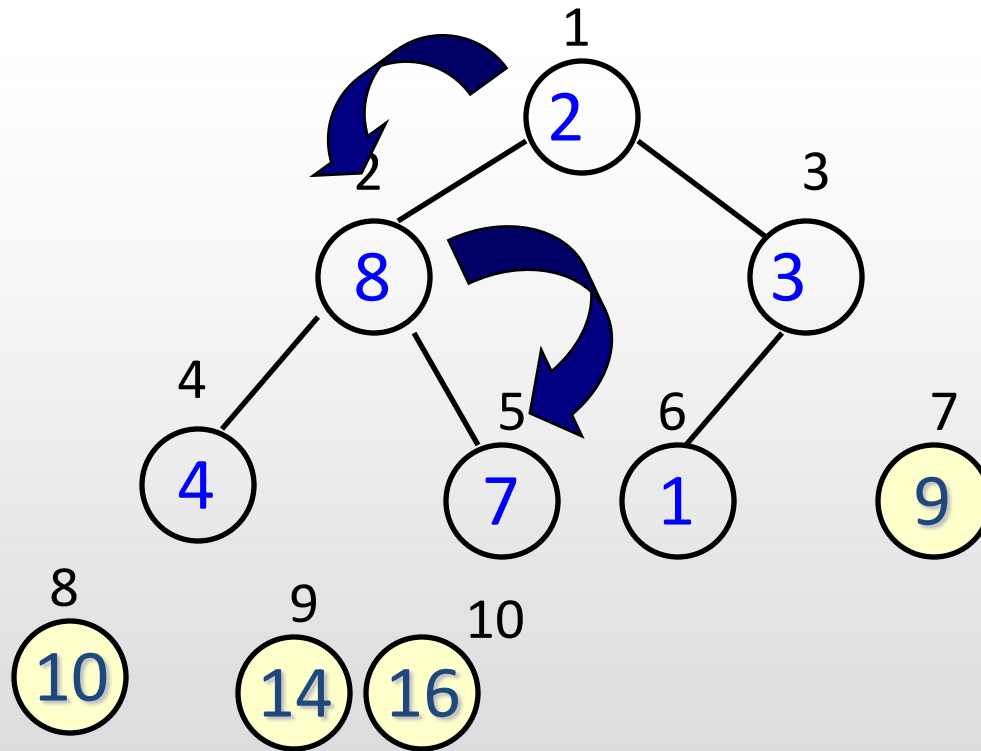
4th pass: i=7



swap(A[1],A[7])



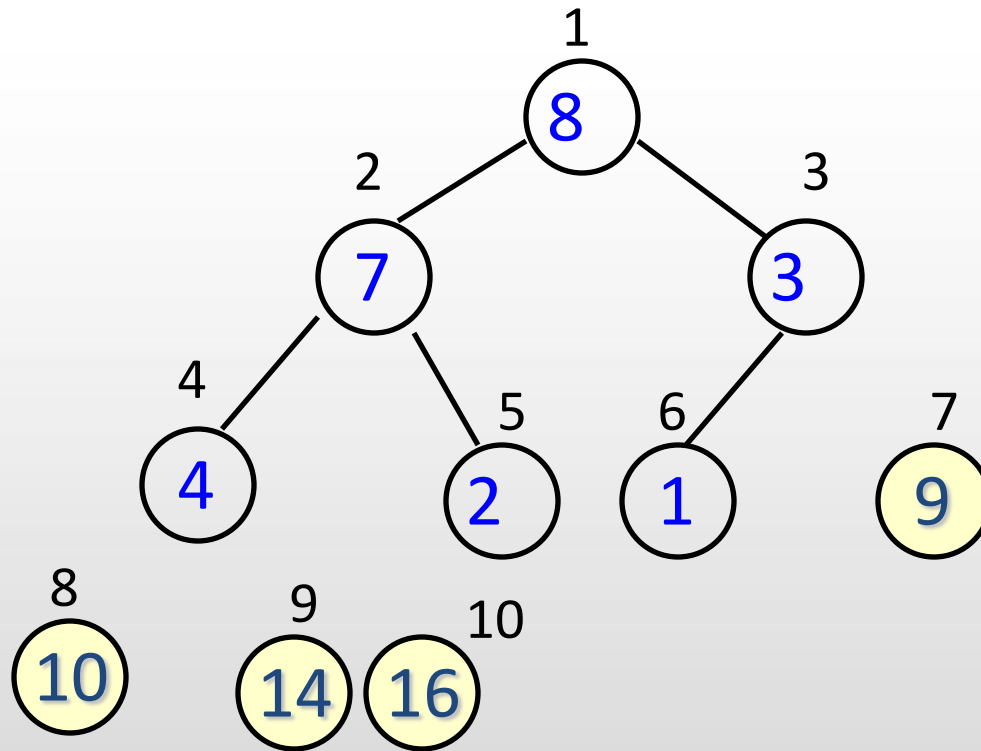
4th pass: $i=7$



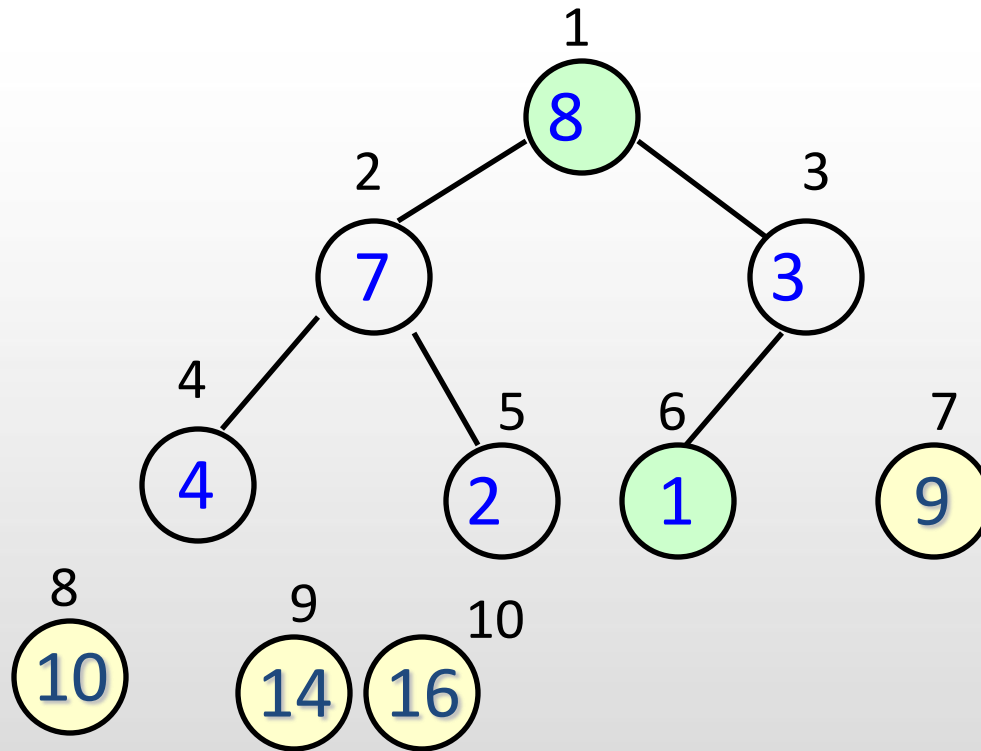
Heapify(A,1,6)



5th pass: $i=6$



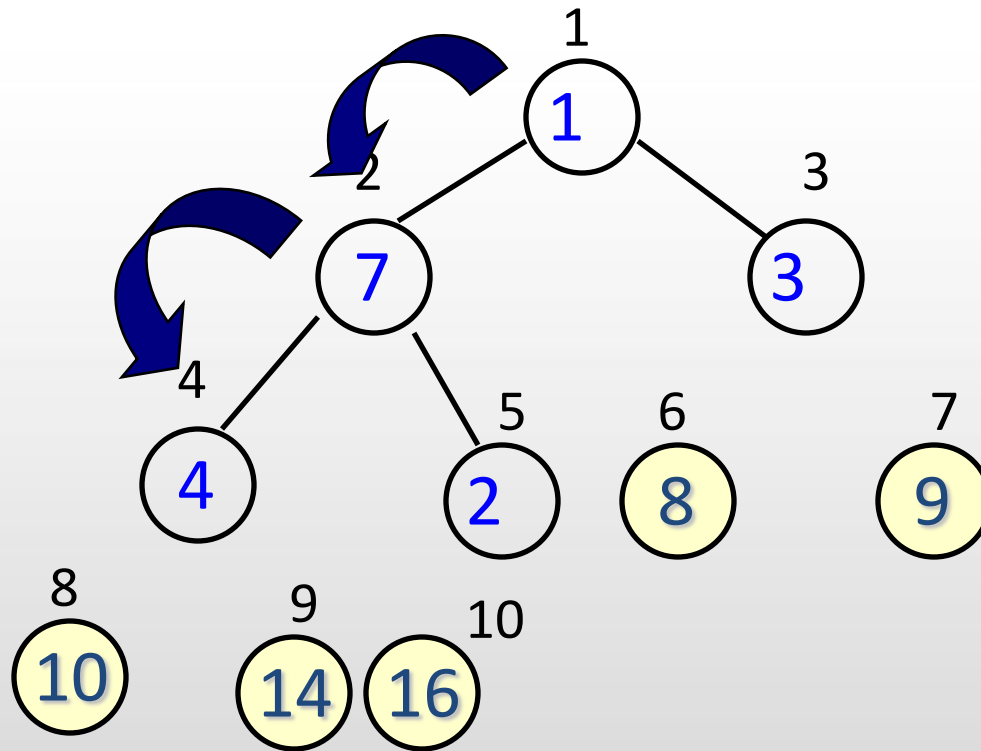
5th pass: i=6



swap(A[1],A[6])



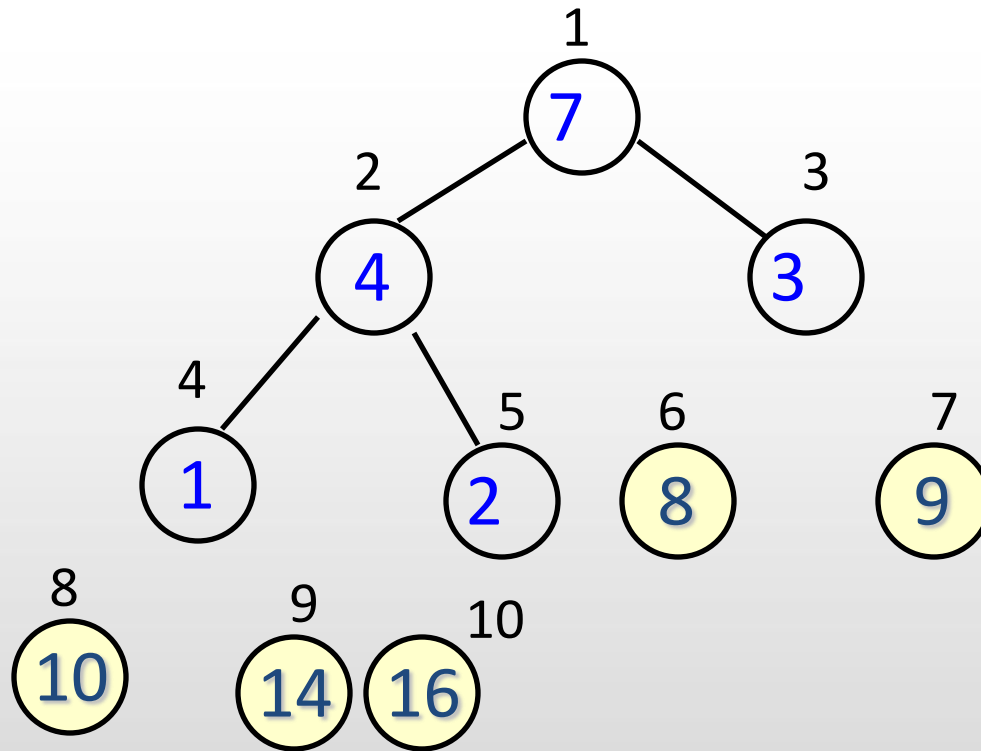
5th pass: $i=6$



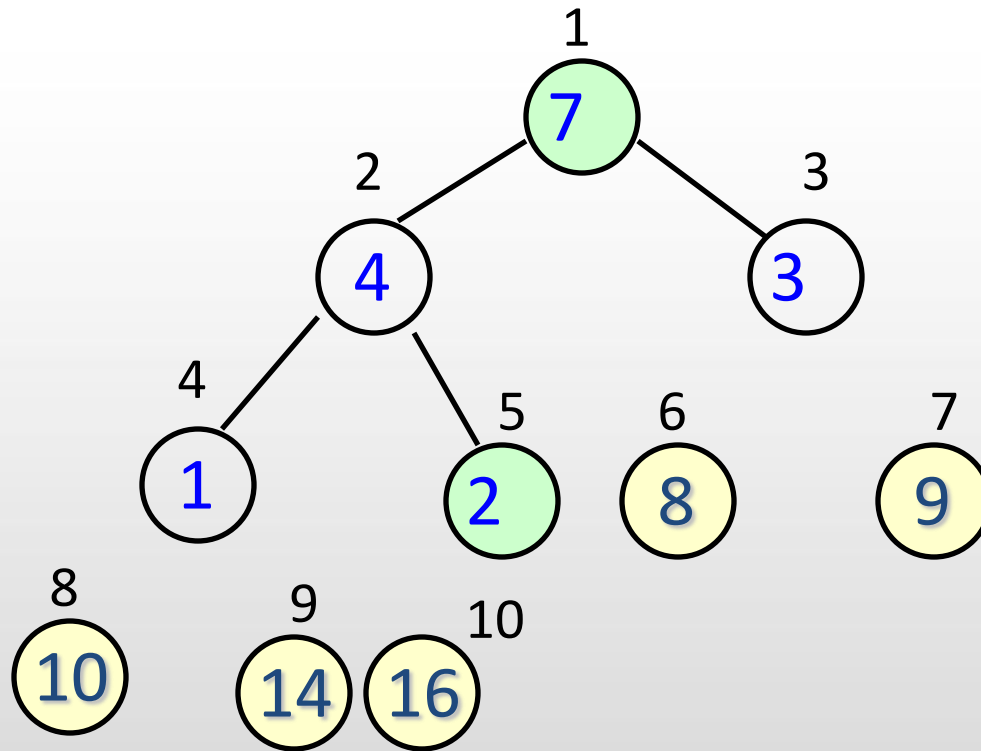
Heapify(A,1,5)



6th pass: $i=5$



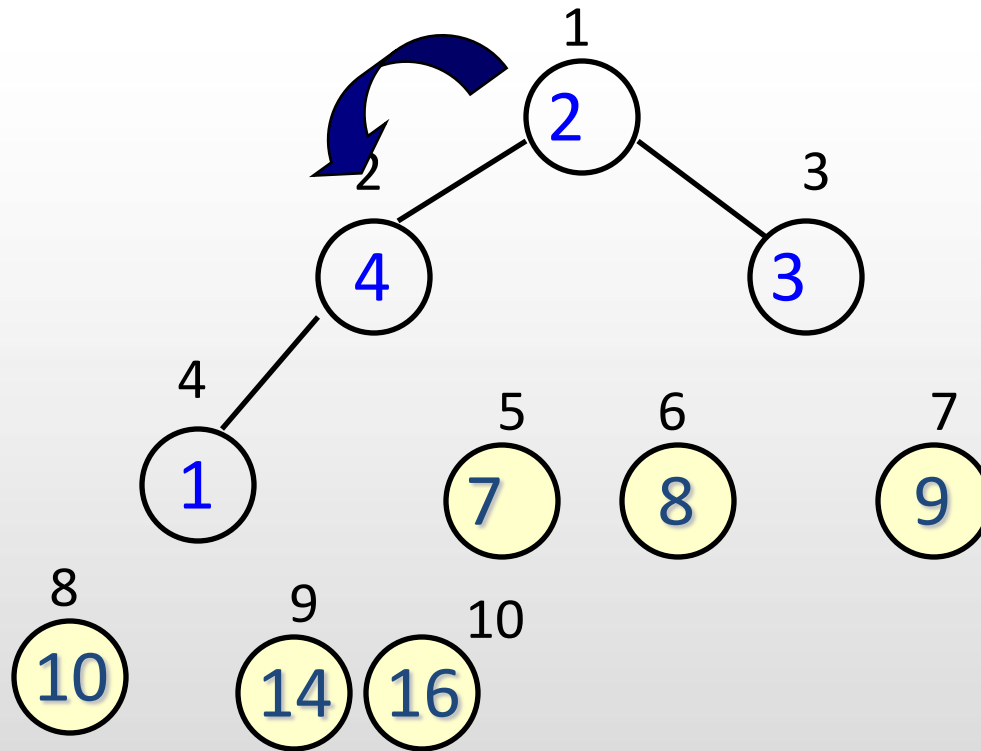
6th pass: i=5



swap(A[1],A[5])



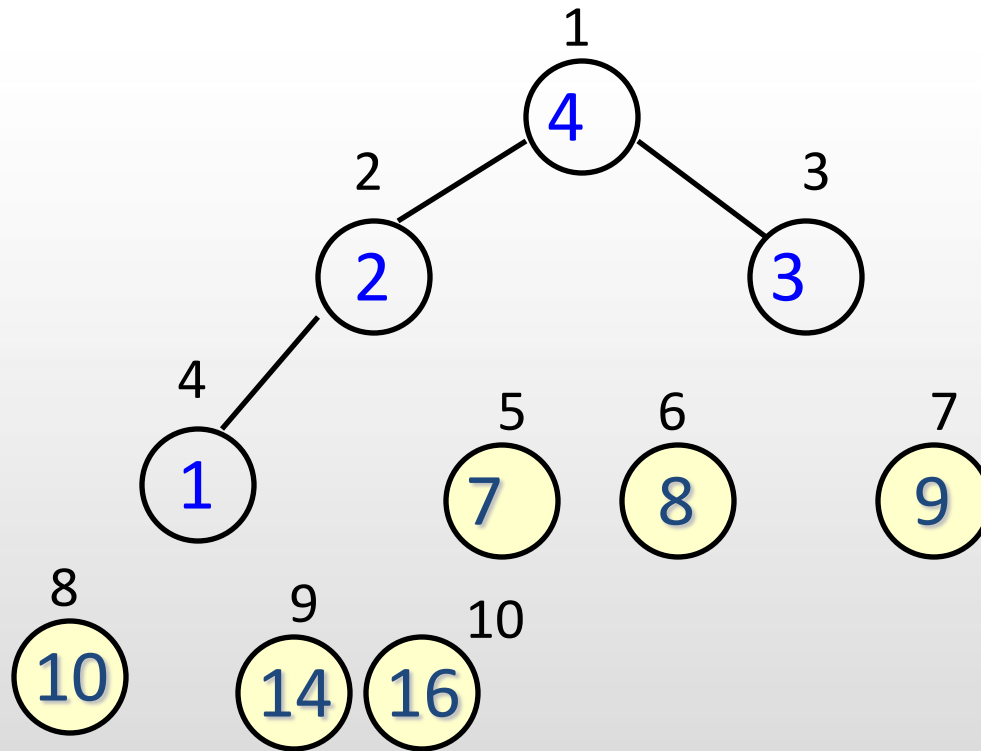
6th pass: $i=5$



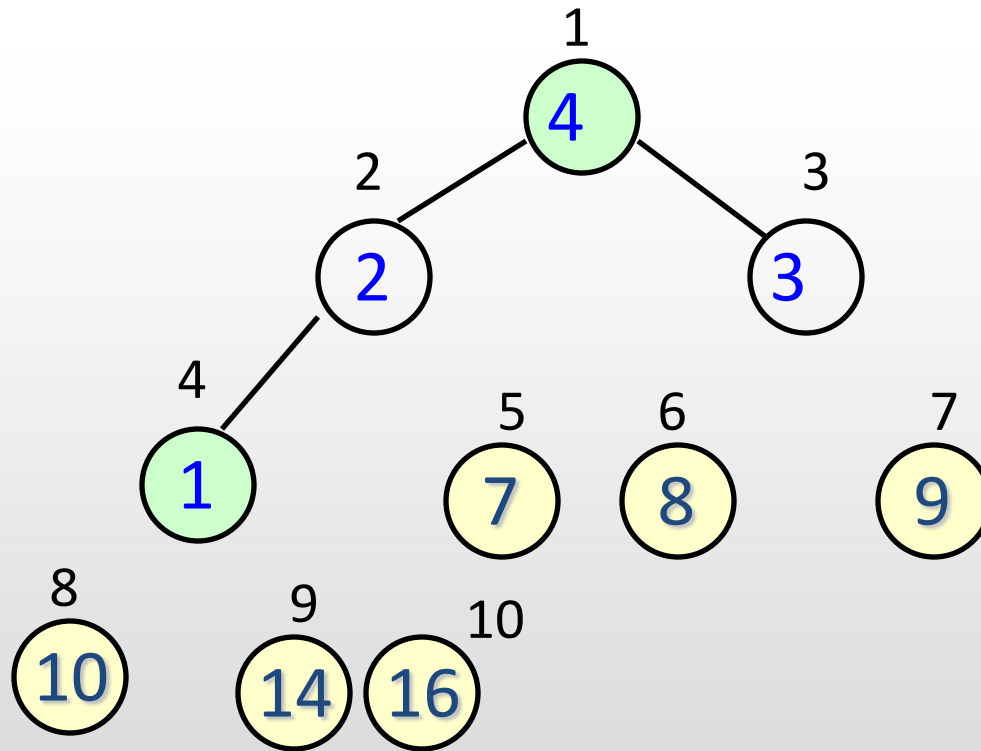
Heapify(A,1,4)



7th pass: i=4



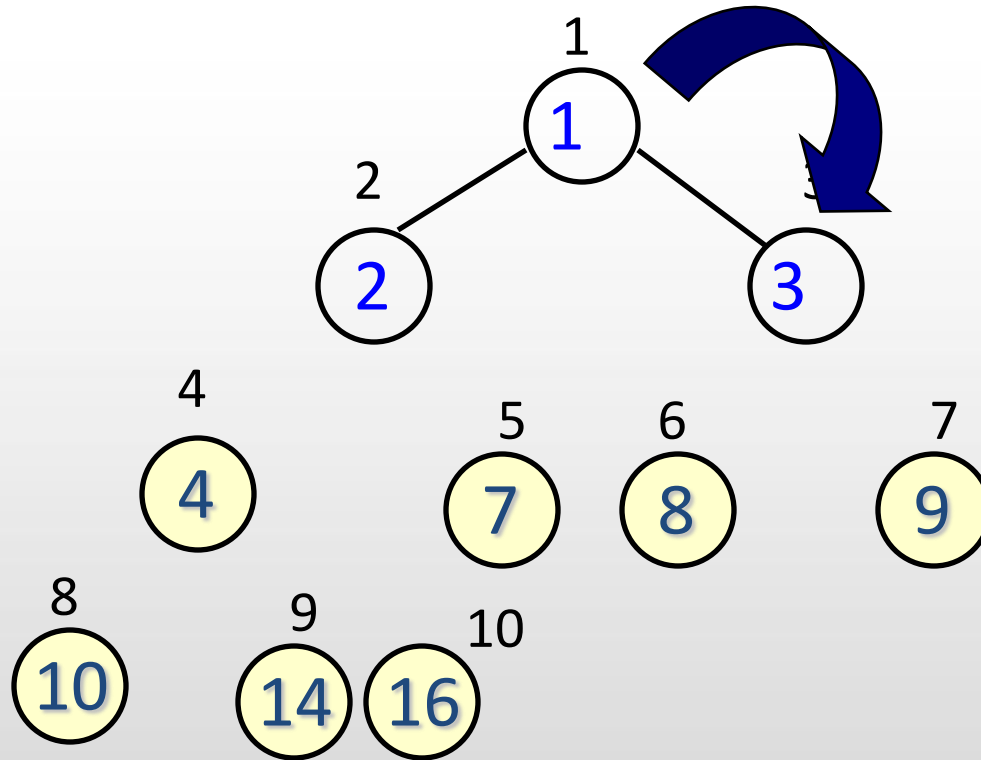
7th pass: i=4



swap(A[1],A[4])



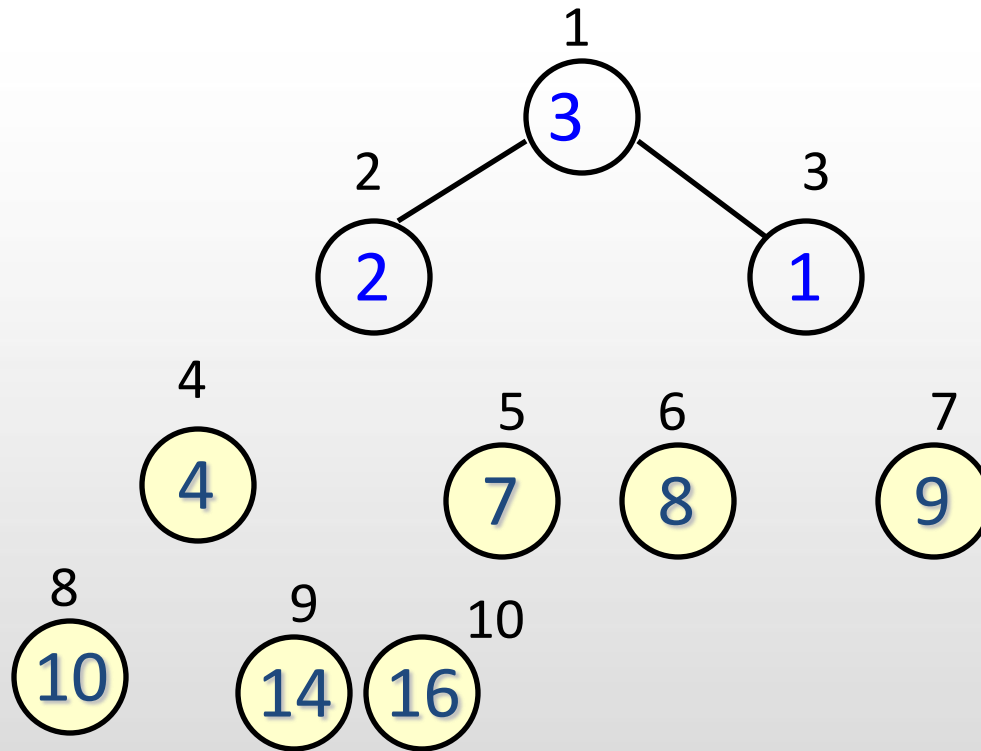
7th pass: $i=4$



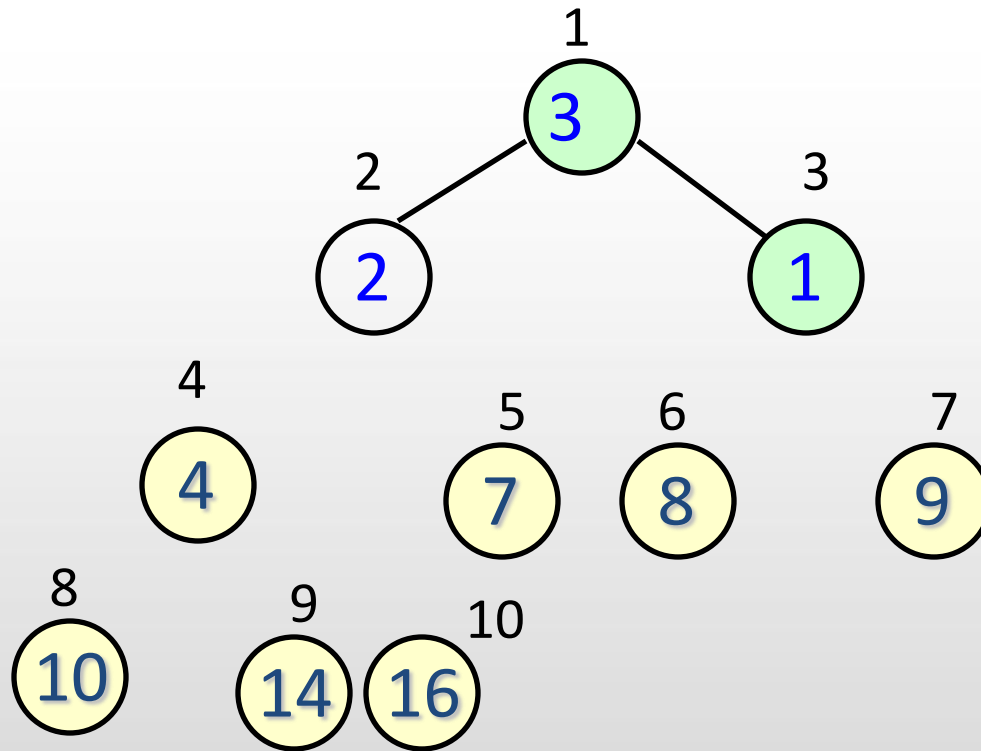
Heapify(A,1,3)



8th pass: $i=3$



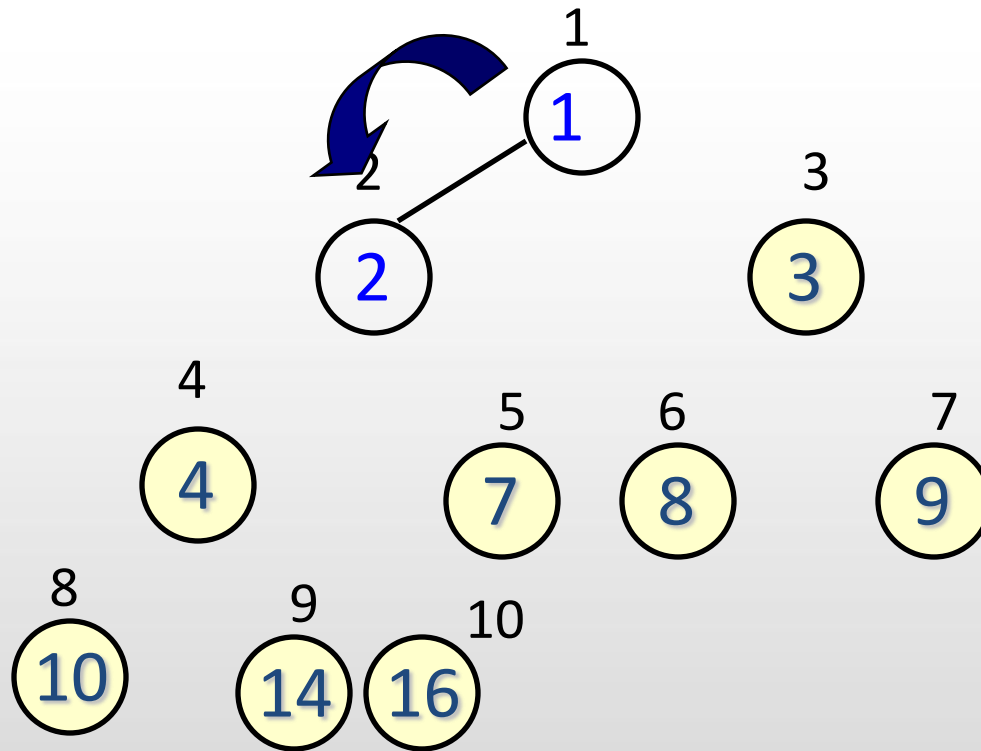
8th pass: i=3



swap(A[1],A[3])



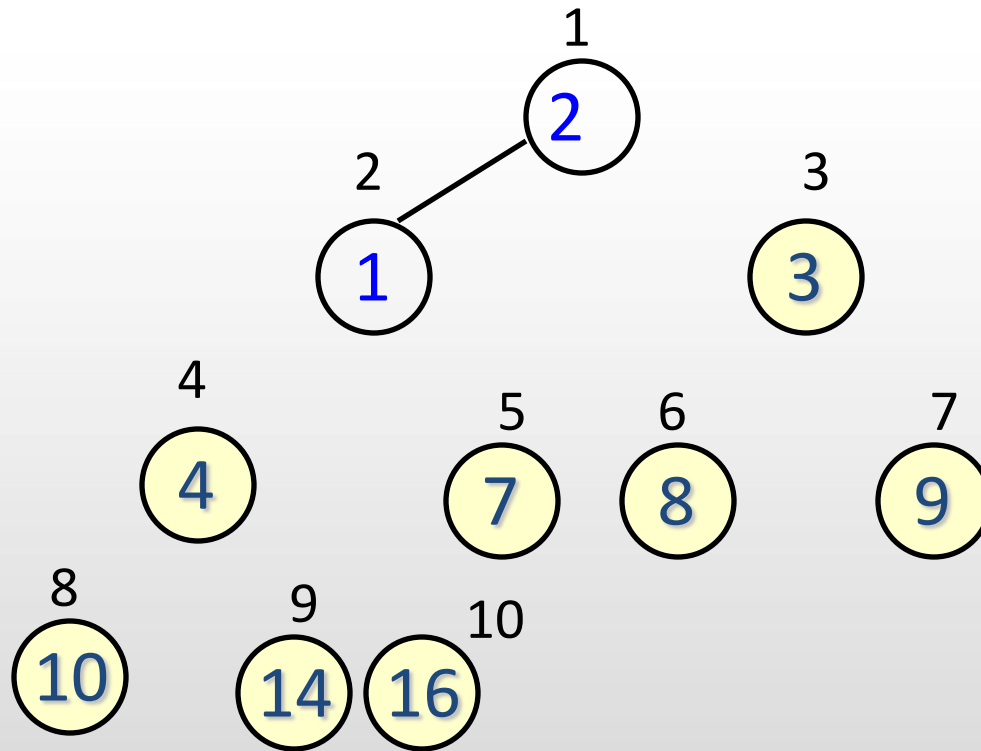
8th pass: $i=3$



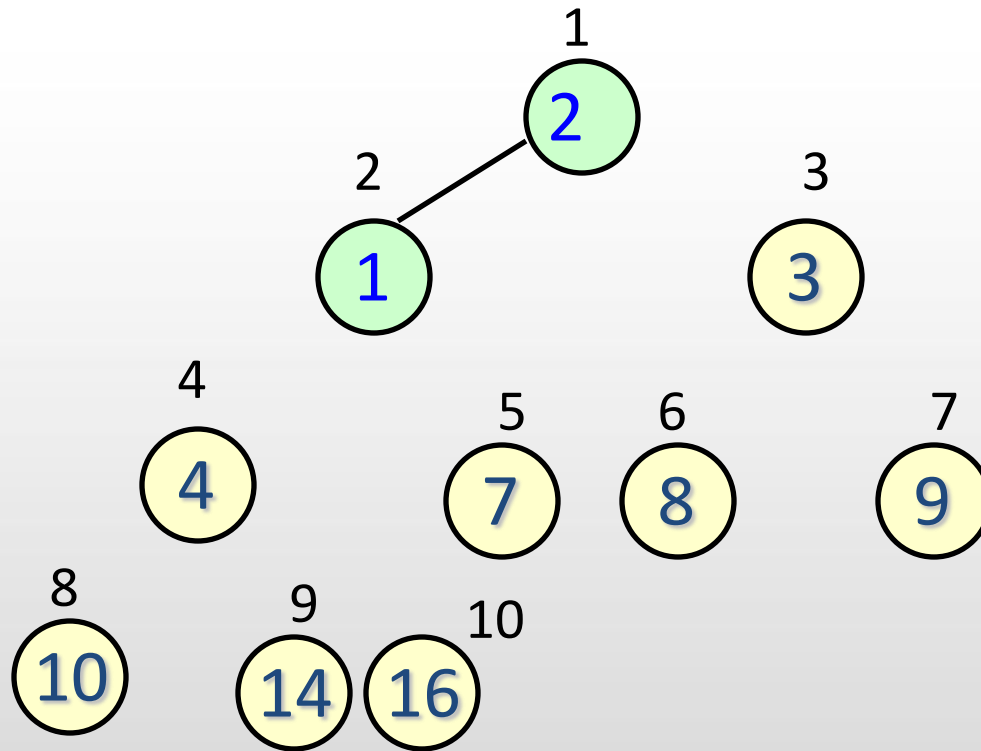
Heapify(A,1,2)



9th pass: $i=2$



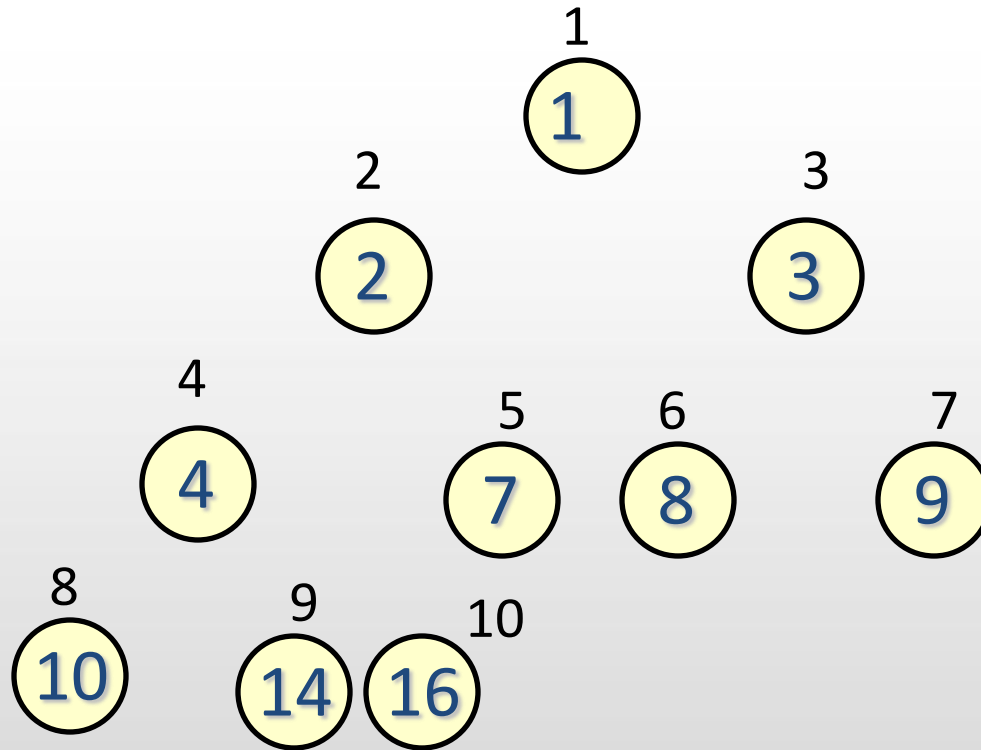
9th pass: $i=2$



`swap(A[1],A[2])`



9th pass: i=2



A

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



Quiz

- Build heap:
15, 8, 4, 3, 1, 7, 11, 10, 20, 9, 6, 5, 12, 14, 13
- In the array implementation (first element is at index 1), what is the value at:
 1. index 3?
 2. index 7?
 3. index 14?

