

ALGORITHMS AND DATA STRUCTURES

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# PRIORITY QUEUES

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## PROBLEMS THAT REQUIRE A PRIORITY CRITERIUM

- ▶ Printing server: Takes several print jobs and executes them in certain order (e.g. according to the number of pages)
- ▶ Resources distribution: Managing limited resources such as bandwidth. If outgoing data queues due to insufficient bandwidth, all other requests can be halted and sent the important ones according to priority
- ▶ Emergency Room: Tend to patients according to the urgency of their health situation

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# PRIORITY QUEUES

- ▶ is an abstract data type that allows (at least)
  - ▶ **insert**: does the obvious thing
  - ▶ **deleteMin**: returns and removes minimum element
- ▶ can be viewed as queues that bookkeep some sort of order

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# PRIORITY QUEUES

- ▶ is an abstract data type that allows (at least)
  - ▶ **insert**: does the obvious thing
  - ▶ **deleteMin**: returns and removes minimum element
- ▶ can be viewed as queues that bookkeep some sort of order
- ▶ Queue analogues
  - ▶ **insert** would be the equivalent of enqueue
  - ▶ **deleteMin** would be equivalent of dequeue

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# PRIORITY QUEUES

## ▶ Applications

- ▶ Bandwidth management of info transmission
- ▶ SO process scheduler
- ▶ Implementation of greedy algorithms
- ▶ heapsort: sorting algorithm
- ▶ Discrete-event simulations

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# PRIORITY QUEUES

## ▶ Implementation

- ▶ Linked list: insertion  $O(1)$ ; delete  $O(N)$
- ▶ If sorted: insertion  $O(N)$ ; delete  $O(1)$
- ▶ Binary search tree: both operations  $O(\lg N)$
- ▶ If balanced: worst-case bound  $O(\lg N)$

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# BINARY HEAP

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- ▶ is a binary tree that is complete (exception: deepest layer)
- ▶ has two properties:
  - ▶ **structure property**, and
  - ▶ **heap-order property**



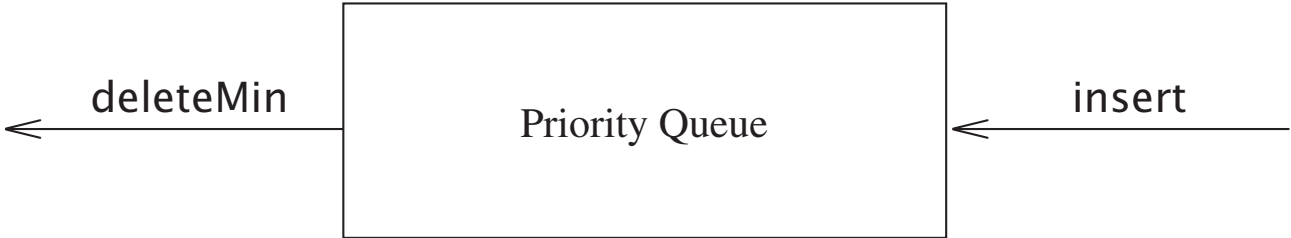
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# BINARY HEAP

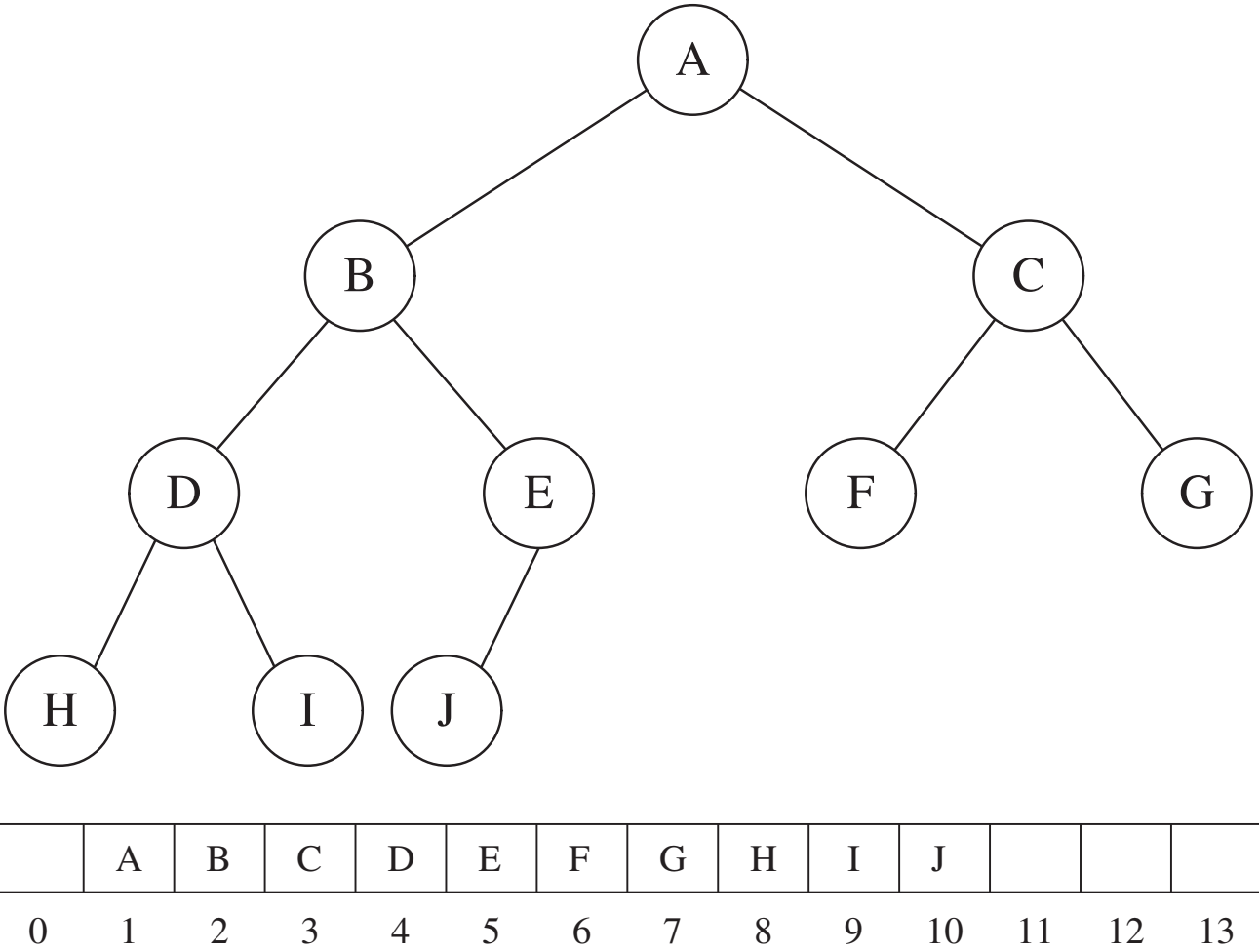
- ▶ is an implementation of a priority queue
- ▶ is a binary tree that is complete (exception: deepest layer)
- ▶ has two properties:
  - ▶ **structure property**, and
  - ▶ **heap-order property**
- ▶ a heap operation might destroy one of such properties
- ▶ an operation can never end without restoring properties

# BINARY HEAPS & PRIORITY QUEUES

priority queue



binary heap



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# BINARY HEAP

## ▶ Structure property

- ▶ a heap is a complete binary tree
- ▶ for depth  $h$  it has at most from  $2^h$  to  $2^{h+1}-1$  nodes
- ▶ heap's regularity  $\Rightarrow$  can be casted to an array w/o links
- ▶ leads to extremely fast traversing operations
- ▶ for an element at position  $i$ : parent  $\lfloor i/2 \rfloor$ , children  $2i$  and  $2i+1$

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# BINARY HEAP

## ▶ Heap-order property

- ▶ makes sense to have minimum element at root because we want to find it
- ▶ then in a tree all nodes should be smaller than all of its descendants
- ▶ in a heap, for every node  $X$ , the key of its parent is smaller than (or equal to)  $X$ 's key
- ▶ exception is the root node which has no parent

## BINARY HEAP: INTERFACE

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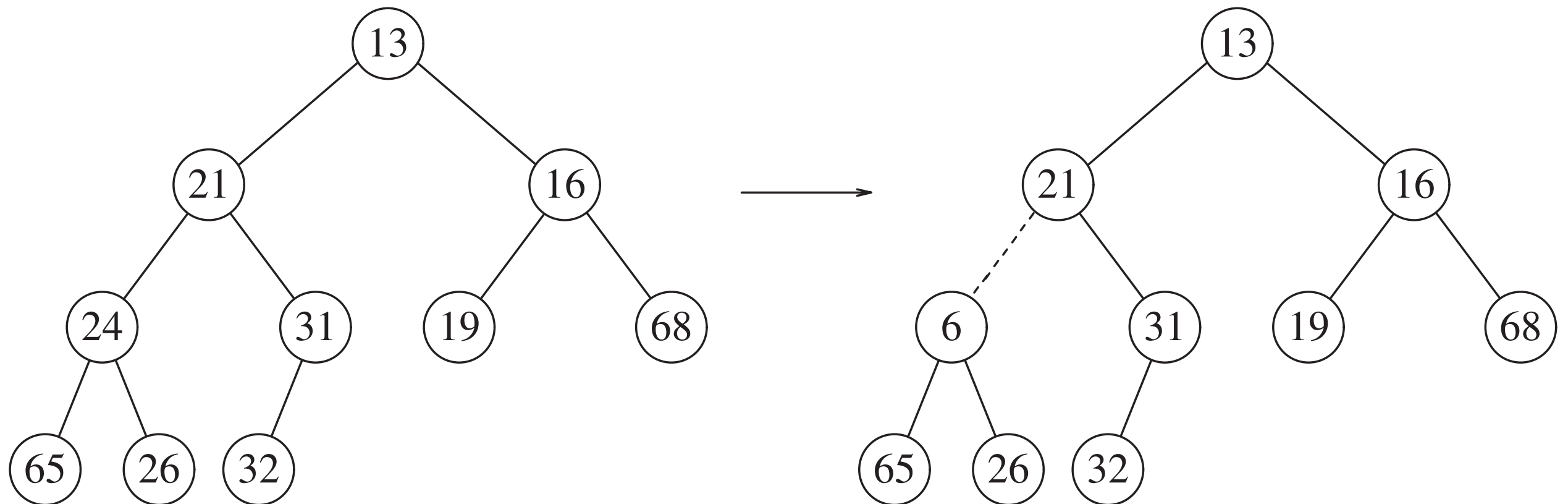
```
template <typename keyType>
class BinaryHeap {
public:
    BinaryHeap(int capacity = 100);
    BinaryHeap(vector<keyType> & items);

    bool isEmpty();
    const keyType & findMin();
    void insert(keyType & x);
    void deleteMin();
    void empty();

private:
    int size;
    vector<keyType> array;

    void buildHeap();
    void percolateDown(int hole);
}
```

# BINARY HEAP



Which is a min binary heap?

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# BINARY HEAP OPERATIONS

## ▶ insert

- ▶ insert key X at bottom (structure property)
- ▶ work its way up to right spot (heap-order property)
  - ▶ this is known as **percolate up**

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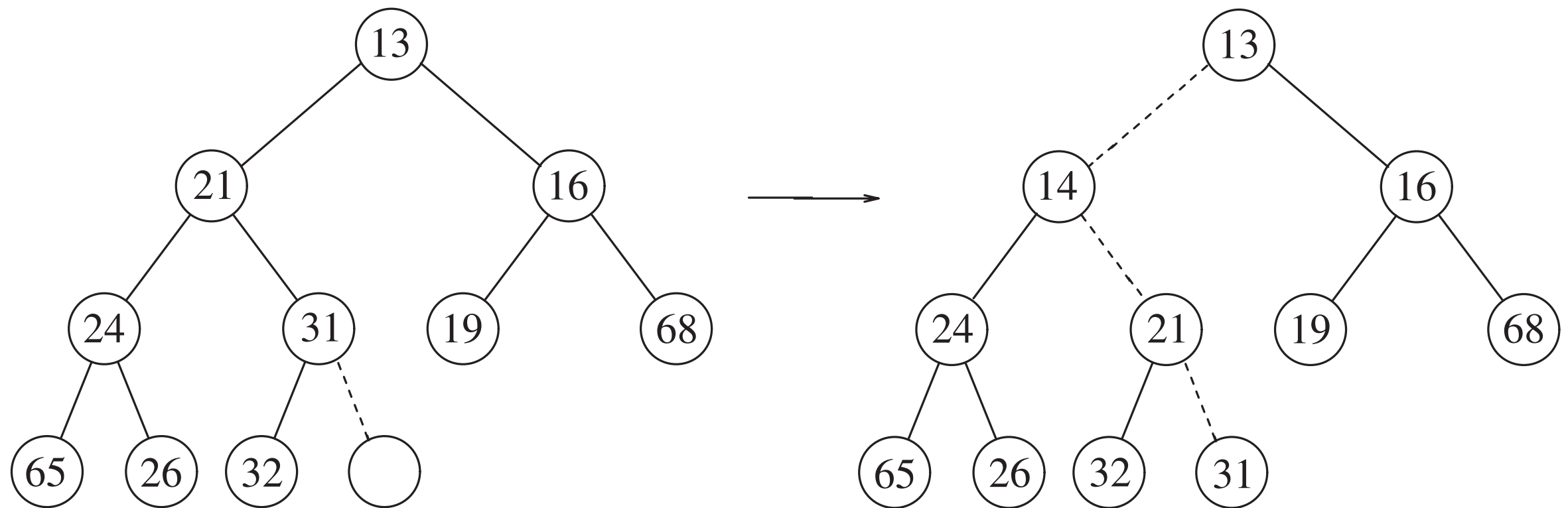
# BINARY HEAP OPERATIONS

## ▶ insert

- ▶ insert key  $X$  at bottom (structure property)
- ▶ work its way up to right spot (heap-order property)
  - ▶ this is known as *percolate up*
- ▶ **2.607** comparisons on average to perform an insert
- ▶ so the average insert moves an element up **1.607** levels
- ▶ time to do the insertion could be as much as  **$O(\lg N)$**



# BINARY HEAP OPERATIONS



inserting item 14

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# BINARY HEAP OPERATIONS

## ▶ deleteMin

- ▶ easy: finding the minimum; hard: actually removing it
- ▶ we remove the minimum
- ▶ move the hole created down choosing always to move up the smallest children in current node (the path of minimum children)

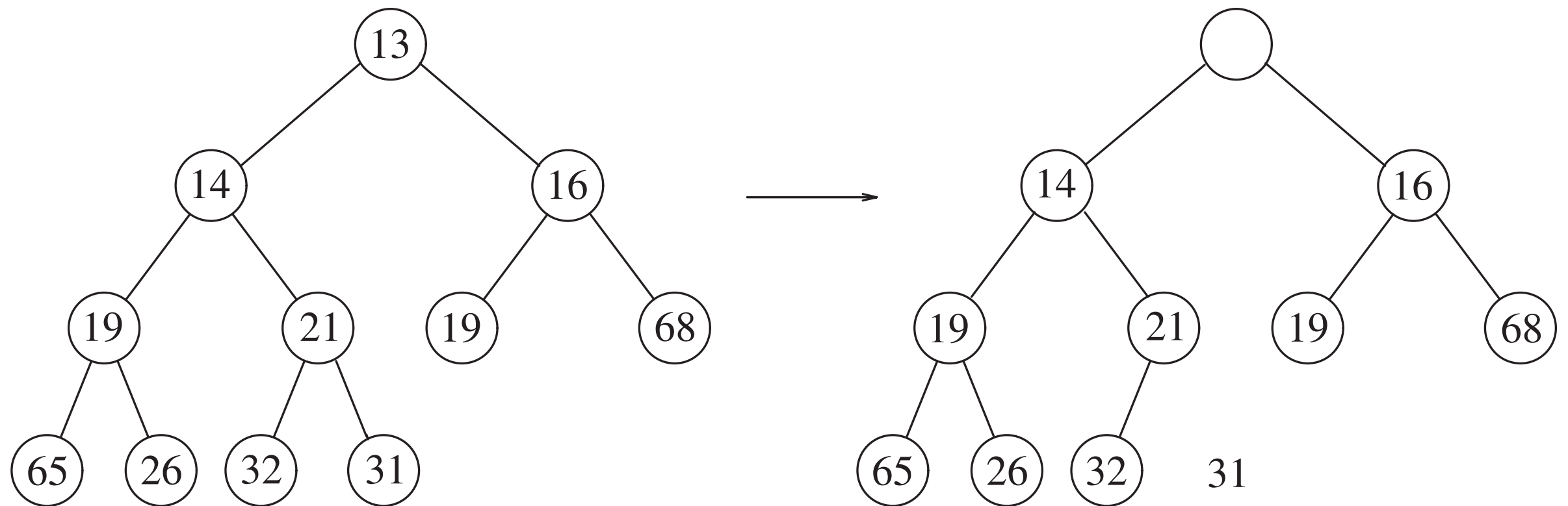
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# BINARY HEAP OPERATIONS

## ▶ deleteMin

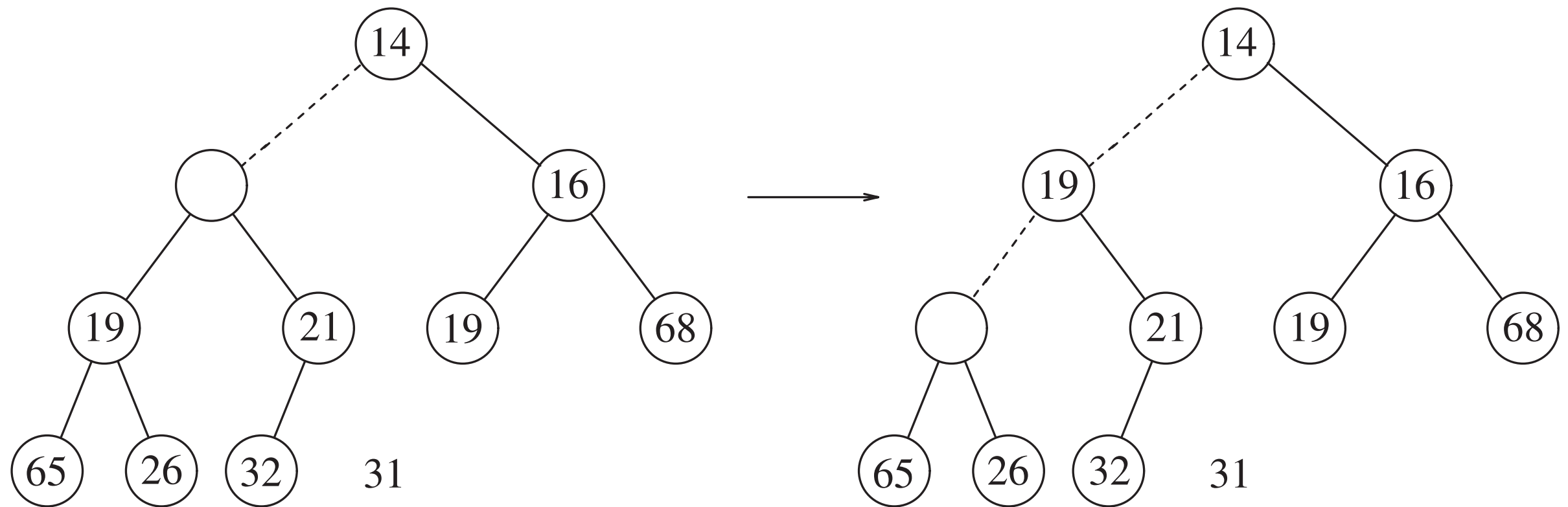
- ▶ easy: finding the minimum; hard: actually removing it
- ▶ we remove the minimum
- ▶ move the hole created down choosing always to move up the smallest children in current node (the path of minimum children)
  - ▶ this is known as *percolate down*
- ▶ worst-case running time for this operation is  $O(\lg N)$

# BINARY HEAP OPERATIONS



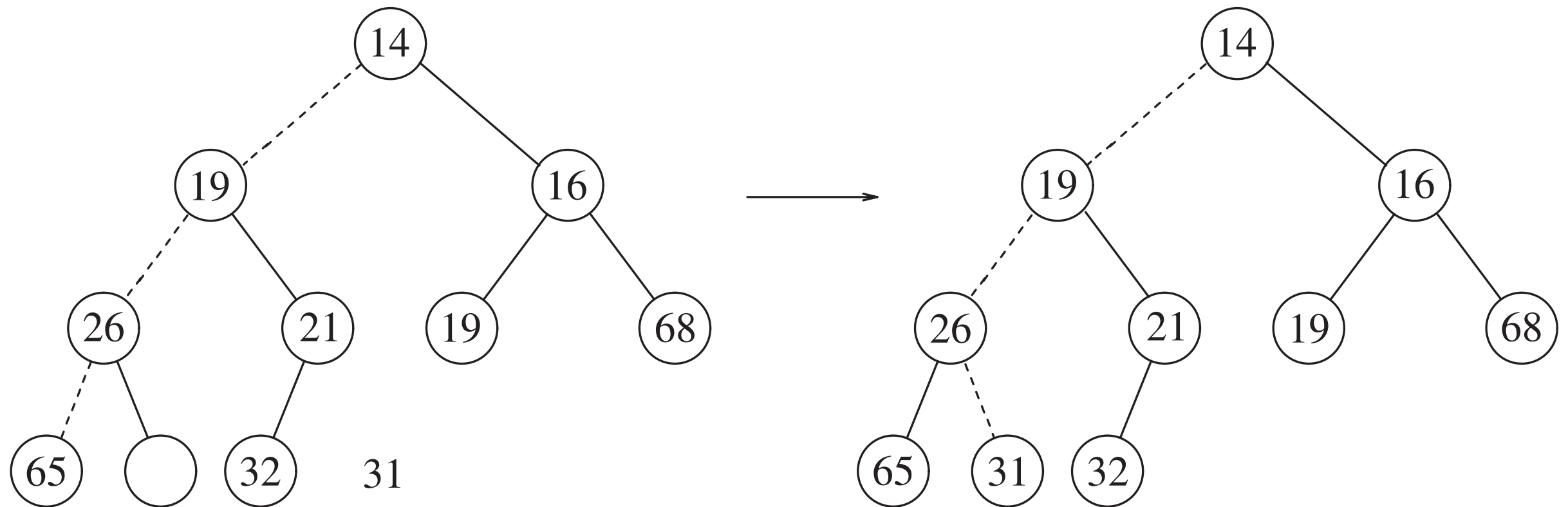
deleting minimum entry

# BINARY HEAP OPERATIONS



deleting minimum entry

# BINARY HEAP OPERATIONS



deleting minimum entry

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# BINARY HEAP OPERATIONS

## ▶ Other operations

- ▶ How to find the maximum? (another ADT)
- ▶ How to change the key (priority) of a given node?
- ▶ How to remove a node at a given position?
- ▶ How to build a heap from an array of elements?

## MAINTAINING THE HEAP-ORDER PROPERTY

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**FUNCTION** max\_heapify:

**INPUT:** heap A, integer i

**OUTPUT:** NONE

**USAGE:** max\_heapify(A, i)

**BEGIN**

l, r = left(i), right(i)

**IF** l <= A.size **AND** A[l] > A[i]

largest = l

**ELSE**, largest = i

**IF** r <= A.size **AND** A[r] > A[largest]

largest = r

**IF** largest != i

swap(A[i], A[largest])

max\_heapify(A, largest)

**END** // max\_heapify



## BUILDING A MAX-HEAP

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```
FUNCTION build_max_heap:
  INPUT: array A
  OUTPUT: heap B
  USAGE: B = build_max_heap(A)
BEGIN
  A.size = A.length

  FOR i = floor(A.size / 2), 1
  BEGIN
    max_heapify(A, i)
  END

  RETURN A
END // build_max_heap
```

## RETURNING MAXIMUM ELEMENT IN MAX-HEAP

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```
FUNCTION heap_maximum:  
  INPUT: heap A  
  OUTPUT: valueType A[1]  
  USAGE: max = heap_maximum(A)  
BEGIN  
  RETURN A[1]  
END // heap_maximum
```

## REMOVING MAX ELEMENT FROM MAX-HEAP

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**FUNCTION** heap\_remove\_max:

**INPUT:** heap A

**OUTPUT:** valueType max

**USAGE:** max = heap\_remove\_max(A)

**BEGIN**

max = A[1]

A[1] = A[A.size]

A.size = A.size - 1

max\_heapify(A, 1)

**RETURN** max

**END** // heap\_remove\_max

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# APPLICATIONS OF PRIORITY QUEUES

- ▶ **Selection problem**

- ▶ Given a list of  $N$  elements (perhaps ordered) and an integer  $k$
- ▶ Problem: Find the smallest/largest  $k$ -th element?
- ▶ Previous solutions?

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# APPLICATIONS OF PRIORITY QUEUES

## ▶ Selection problem

- ▶ Given a list of  $N$  elements (perhaps ordered) and an integer  $k$
- ▶ Problem: Find the smallest/largest  $k$ -th element?
- ▶ Previous solutions
  - ▶ Sort and get  $k$ -th element
  - ▶ Partially sort and compare  $N-k$  times

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# APPLICATIONS OF PRIORITY QUEUES

## ▶ Selection problem

### ▶ Using binary heaps:

- ▶ `buildHeap` with array of  $N$  elements,  $O(N)$
- ▶ Execute `deleteMin`  $k$  times ( $k$ -th smallest element)
- ▶ Computational complexity?  $O(N+k \lg N)$
- ▶ Keeping record of removes gives a sorted array (*heapsort!*)

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# APPLICATIONS OF PRIORITY QUEUES

## ▶ Event simulation

- ▶ Imagine a queue of customers in a bank being served by  $k$  tellers (input: times of arrival and departure)
- ▶ Problem: what's the average waiting time and line length?
- ▶ Solution: divide problem in events
  - ▶ Event 1: customer arrives (occupying a teller)
  - ▶ Event 2: customer leaves (freeing a teller)

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# APPLICATIONS OF PRIORITY QUEUES

## ▶ Event simulation

- ▶ One way to do it: start a simulation clock at zero ticks
- ▶ Advance the clock one tick at a time, checking if there is an event
  - ▶ If there is, then we process the event(s) and compile statistics
- ▶ When there are no customers left and all the tellers are free, the simulation is over



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# APPLICATIONS OF PRIORITY QUEUES

## ▶ Event simulation

- ▶ There is a problem with this strategy: simulation depends on time not customers (events)
  - ▶ Simulation time could vary greatly
- ▶ *Insight*: advance clock to next time event not to next time tick
- ▶ Since the input is time, we can find out when next event happens and advance the clock to that stage

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# APPLICATIONS OF PRIORITY QUEUES

- ▶ **Event simulation**

- ▶ Better strategy

- ▶ The waiting line can be implemented as a queue
- ▶ Set of events happening in the near future can be organized in a priority queue
- ▶ The next event is thus the next arrival or next departure (whichever is sooner)
- ▶ Computational complexity?  $O(C \lg(k + 1))$

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## OTHER TYPES OF HEAPS

- ▶ **d-heaps** (binary heap is a 2-heap)
  - ▶ **Leftist heap** ([very] unbalanced binary heap, merge well)
  - ▶ **Skew heap** (self-adjusting version of a leftist heap)
  - ▶ **Binomial heap** (better complexity than LH and SH)
- 
- ▶ In the STL: **priority\_queue**