

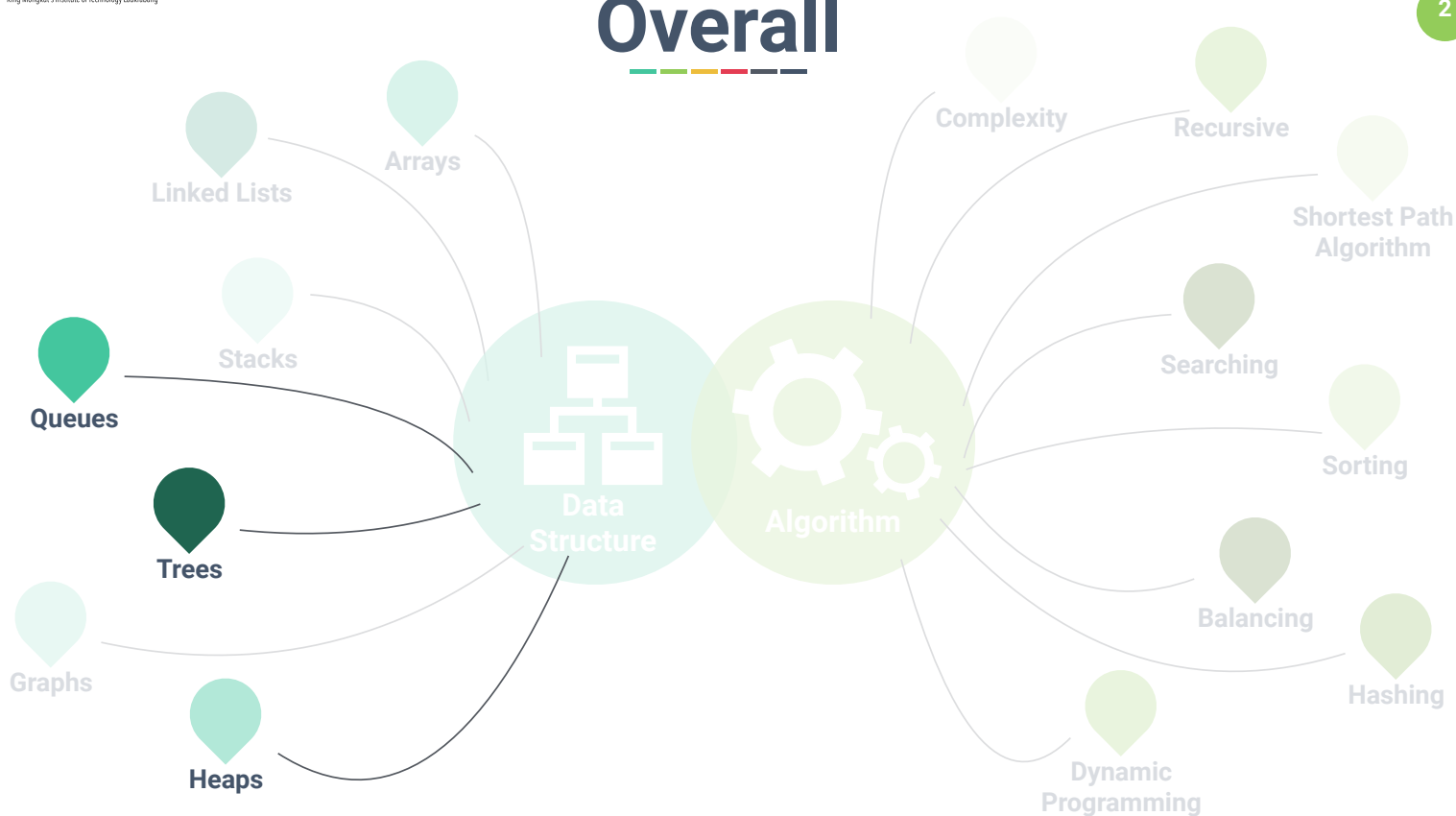
Chapter 7: Trees (Part 2)

(Priority Queues and Binary Heaps)

Dr. Sirasit Lochanachit



Overall



Outline

3

Priority Queues:

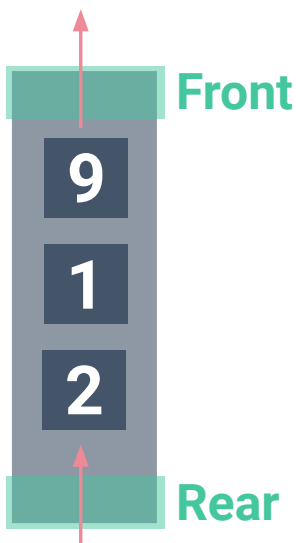
- Properties and methods
- Operation example

Binary Heaps:

- Definition, properties, examples
- Insertion and Deletion
- Consideration and Implementation in Array

Queues

4



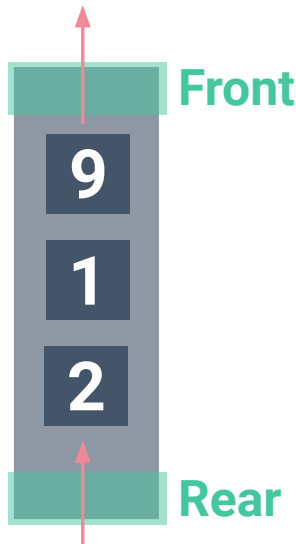
Queue is a collection, which keeps objects in a sequence, that are inserted and removed according to the **first-in first-out** (FIFO) principle [1].

A FIFO queue with priorities?

- Airline's waiting queue: First Class, Business Class, Economy Class

Queues

5



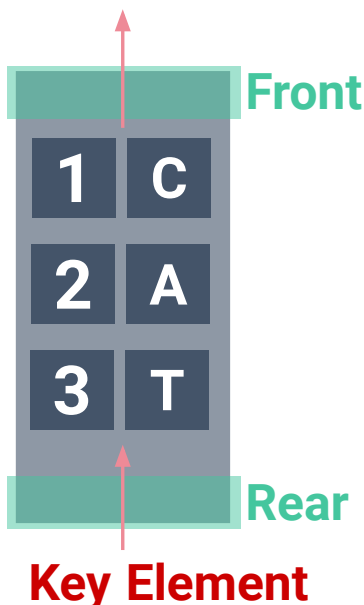
Queue is a collection, which keeps objects in a sequence, that are inserted and removed according to the **first-in first-out** (FIFO) principle [1].

Another variation is a **priority queue**. It stores prioritised elements that allows arbitrary element insertion and allows the deletion of the element that has first priority [1].

[1] Michael T. Goodrich et al., Data Structures and Algorithms in Python, 2013

Priority Queues Properties

6



- When a new element is added in the queue, its priority is determined by an associated **key**.
- The order of elements is determined by their priority.
- The highest priority items are at the front of the queue.
- The lowest priority elements are at the back.
- A new item that is enqueued could be moved to the front of the queue.

Priority Queue Methods

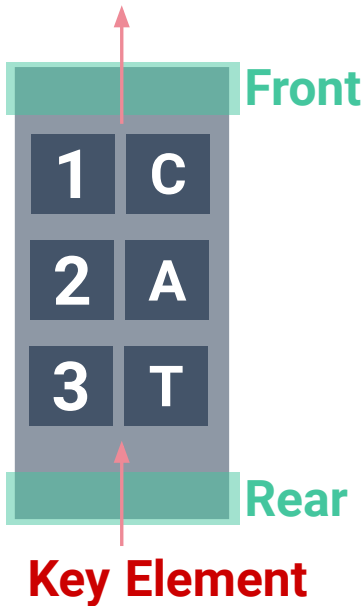
Formally, there are two main operations for priority queues P :

1) $P.add(key, value)$

Insert an element with *key* and *value* into the queue.

2) $P.remove_min()$

Remove and return the *key* and *value* that have the lowest priority; return error if the queue is empty.



Priority Queue Methods

Additional operations for priority queues P :

1) $P.min()$

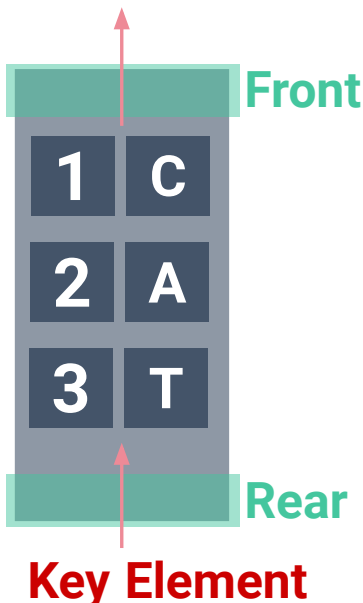
Return (but do not remove) the key and value that have the lowest priority; return error if the queue is empty.

2) $P.is_empty()$

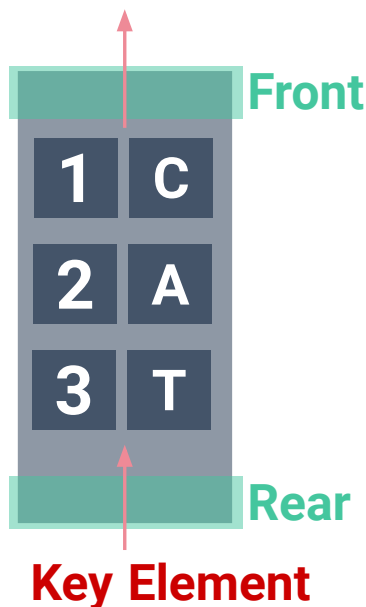
Check whether a priority queue is empty.

3) $len(P)$

Return the number of elements in a priority queue P .



Priority Queue



Before implementing a priority queue, the following assumptions should be considered:

- Keys of multiple elements can be either equal or unique.
- Once a key is assigned to the element and it has been added to a priority queue, it should be either fixed or adjustable.

Operation Example

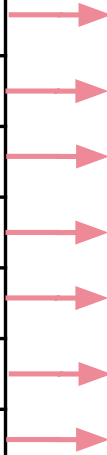
| Operation | Return Value | Priority Queue [first, ..., last] | | |
|----------------|--------------|--------------------------------------|--------|--------|
| P.add(5, A) | - | (5, A) | | |
| P.add(9, C) | - | (5, A) | (9, C) | |
| P.min() | (5, A) | (5, A) | (9, C) | |
| P.add(2, B) | - | (2, B) | (5, A) | (9, C) |
| P.remove_min() | (2, B) | (5, A) | (9, C) | |
| P.is_empty() | False | (5, A) | (9, C) | |
| len(P) | 2 | (5, A) | (9, C) | |

Operation Exercise

11

| Operation | Return Value |
|----------------|--------------|
| P.add(5, A) | - |
| P.add(4, B) | - |
| P.remove_min() | |
| P.add(7, F) | - |
| P.add(3, J) | |
| P.remove_min() | |
| P.remove_min() | |

Priority Queue
[first, ..., last]



Asymptotic Performance

12

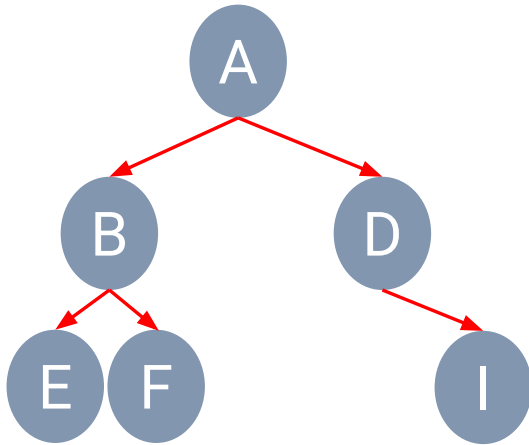
n denotes the number of elements or nodes.

| Operation | Running Time (unsorted list) | Running Time (sorted list) |
|----------------|---------------------------------|-------------------------------|
| P.add(k, v) | $O(1)$ | $O(n)$ |
| P.remove_min() | $O(n)$ | $O(1)$ |
| P.min() | $O(n)$ | $O(1)$ |
| P.is_empty() | $O(1)$ | $O(1)$ |
| len(P) | $O(1)$ | $O(1)$ |

A solution that is more efficient?

Binary Heap

13



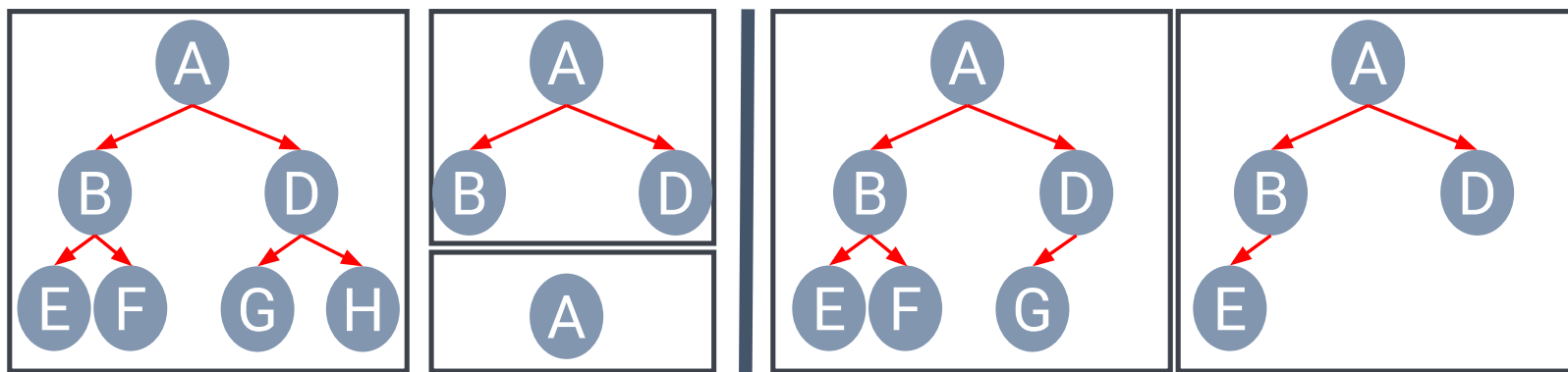
- A **heap** is a binary tree that stores elements and has the following properties:
 - For every node except the root, the key stored in a node is greater than or equal to the key stored at a node's parent - **min heap**.
 - A minimum key is located at the root node.
 - A heap has to be a **complete** or **nearly complete** binary tree.

[1] Michael T. Goodrich et al., Data Structures and Algorithms in Python, 2013

Types of Binary Trees

14

- A binary tree is **nearly complete** when every level, except the last, is completely filled and all leaf nodes are as far left as possible.

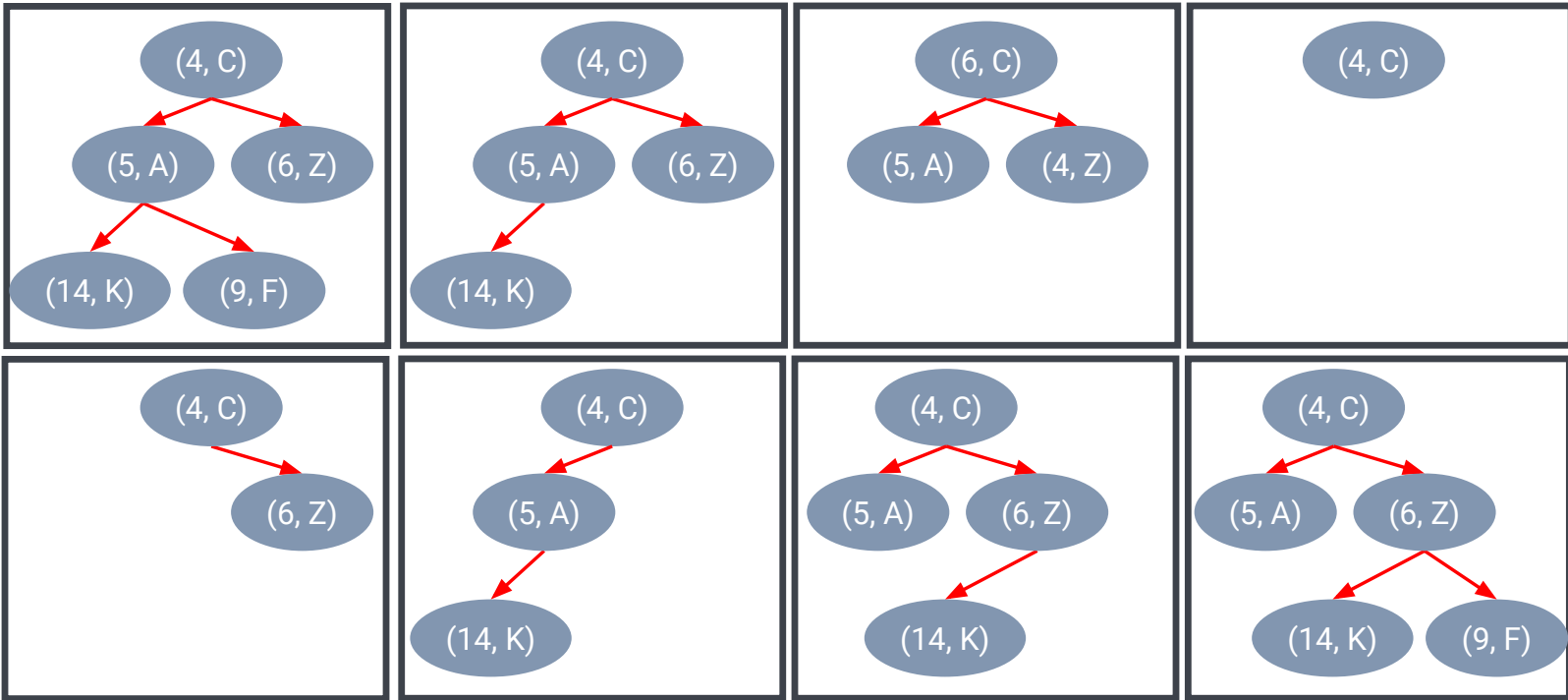


(a) **Complete/Perfect** Binary Tree

(b) **Nearly Complete** Binary Tree
at level 2

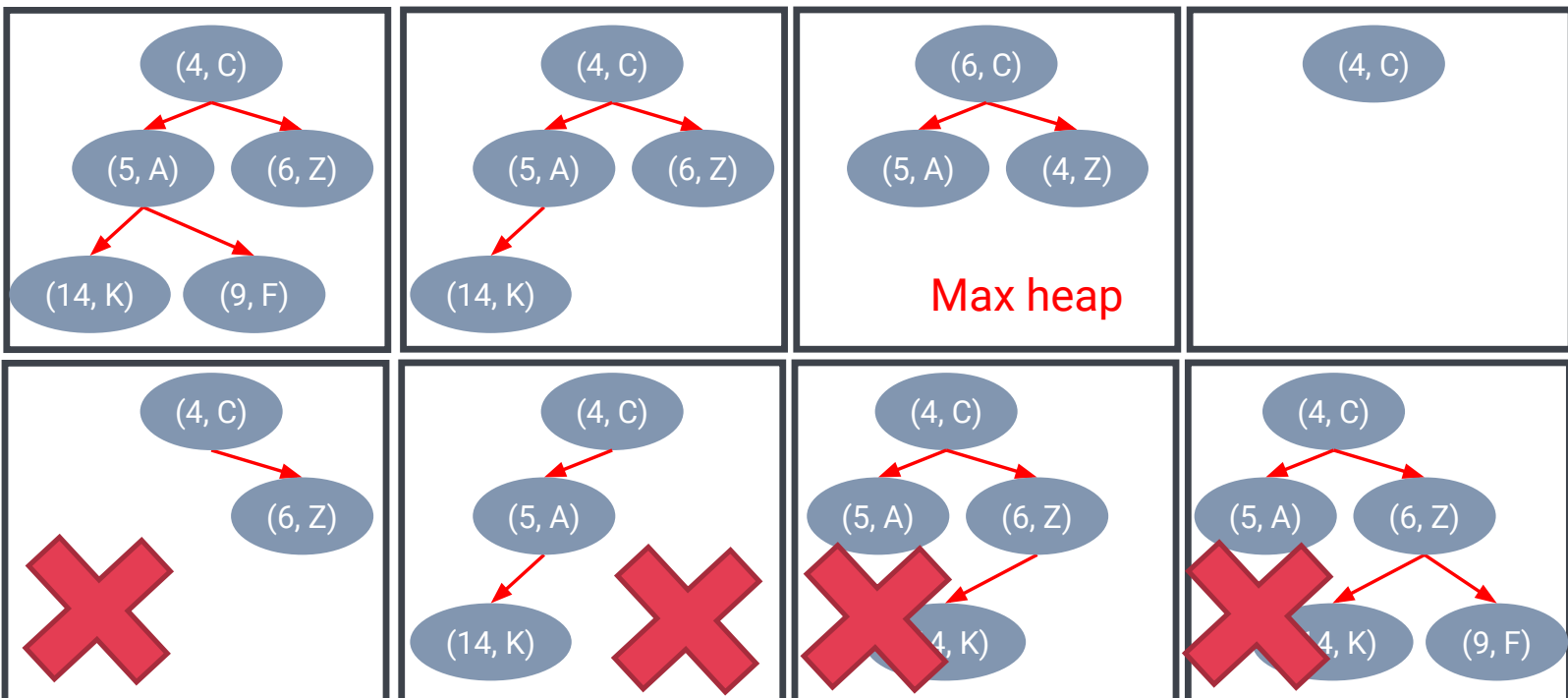
Binary Heap

15



Binary Heap

16



Binary Heap

17

- To allow a binary heap to have a logarithmic performance when performing insertion and deletion, a tree needs to be balanced or **nearly complete**.
- Insertions and removals in logarithmic time is a significant improvement over the list-based implementations.
- Can be implemented using a linked list of an array.

Binary Heap Insertion

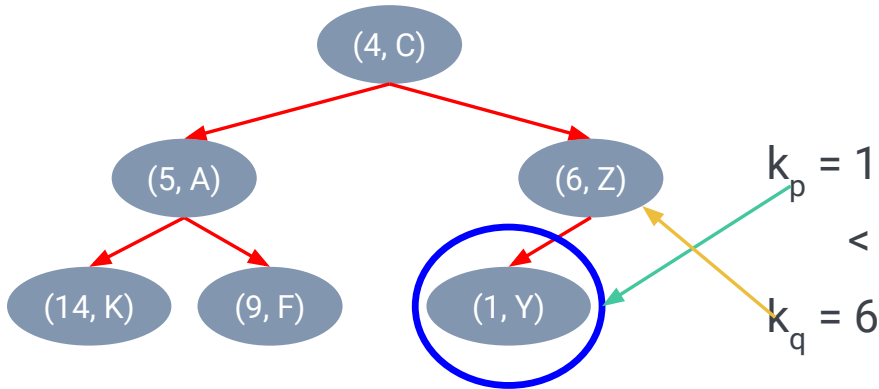
18

- To preserve the nearly complete property, the new node should be inserted at a position p , after the rightmost node at the bottom level, or as the leftmost node of a new level, if the bottom level is full.
- However, the **heap order property** may be violated where the key p is less than key of p 's parent, which is denoted as q ($k_p < k_q$).
 - The heap order needs to be restored by swapping key-value pairs, moving the new item up one level.
 - This is done until there is no violation of the heap order property.

Binary Heap Insertion

19

Example of when $k_p < k_q$ after inserting a new node (1, Y).

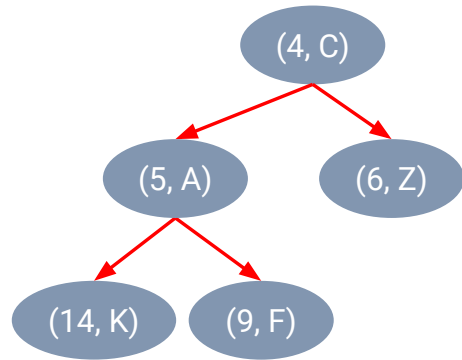


Binary Heap Insertion

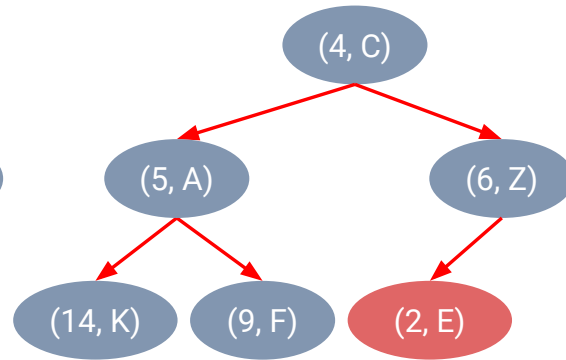
20

- If key p is greater than key q , then the heap order is preserved ($k_p \geq k_q$).
- The upward movement of the newly inserted node through swapping is **up heap bubbling** or **reheap up**.
- The worst case scenario of upheap is moving the new item all the way to the root of heap.
 - The number of swaps executed in method add() is equal to the **height of heap** or **floor of $\log n$** (i.e. $\lfloor \log n \rfloor$).

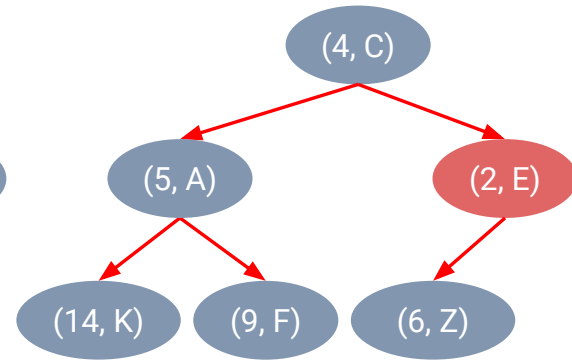
Upheap



Current Binary Heap

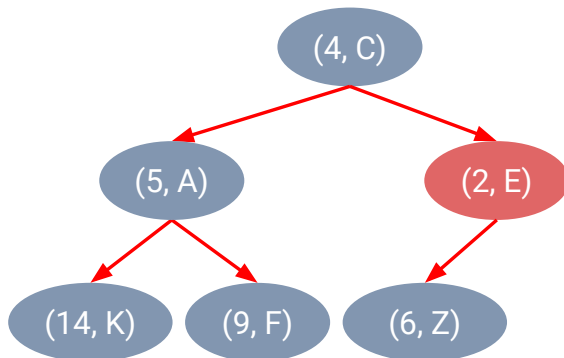


Adding new node
(key, value)

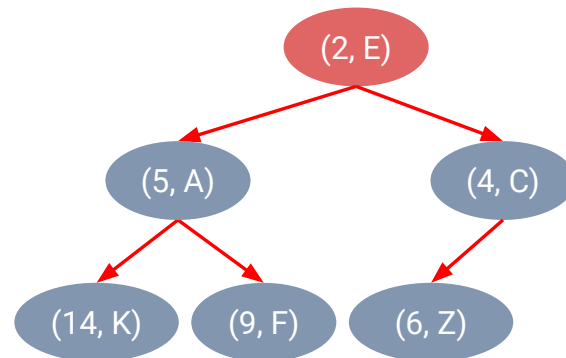


Up heap #1

Upheap



Up heap #1
(cont. from previous slide)



Up heap #2

Binary Heap Removal

- Due to the property of min heap, the item with the **smallest key** is stored at the **root node**.
- However, removing the root node directly would leave two disconnected subtrees.
- To ensure that the heap remains as the nearly complete binary tree, the leaf node at the rightmost position of the bottom level of the tree is deleted.
 - Before removing, the item in the last position is copied to the root node.

Binary Heap Removal

- However, the **heap order property** may be violated where the key p is greater than key of p 's children, which is denoted as q ($k_p > k_c$).
 - The heap order needs to be restored by swapping key-value pairs, moving the new item down one level.
 - When p has two children, the smaller key determines the direction of moving down.
 - This is done until there is no violation of the heap order property.

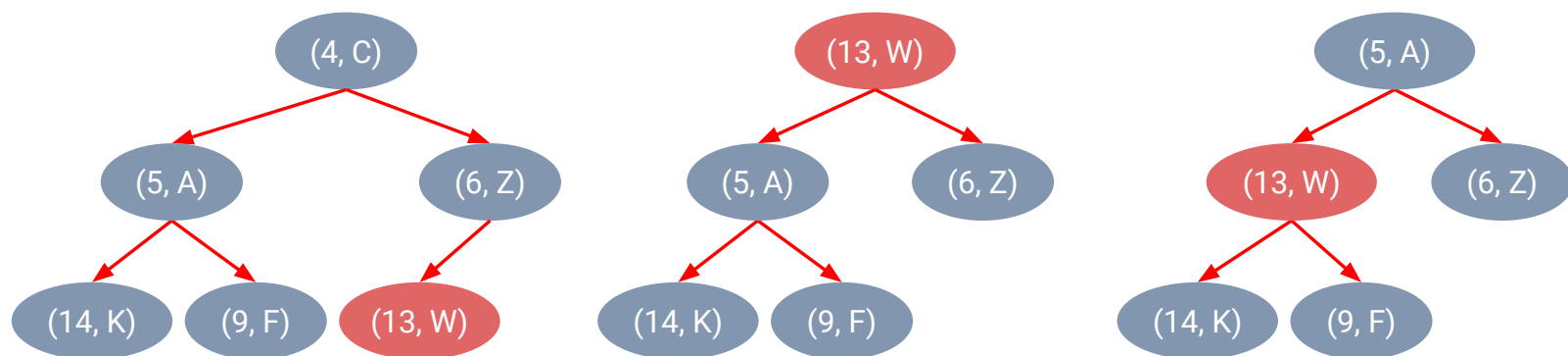
Binary Heap Removal

25

- If key p is less than key c , then the heap order is preserved ($k_p \leq k_c$).
- The downward movement of the new root node through swapping is **down heap bubbling** or **reheap down**.
- The worst case scenario of downheap is moving the root item all the way to the bottom level of the tree.
 - The number of swaps executed in method remove_min() is equal to the **height of heap** or **floor of $\log n$** (i.e. $\lfloor \log n \rfloor$).

Downheap

26

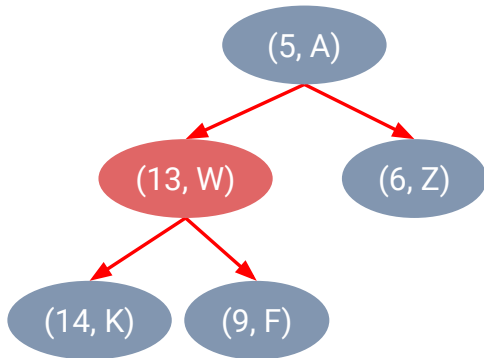


Current Binary Heap

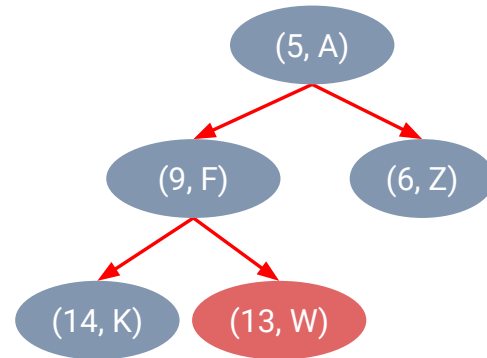
Remove a node with smallest key & copy a rightmost leafnode to the root

Down heap #1

Downheap



Down heap #1
(cont. from previous slide)



Down heap #2

Asymptotic Performance



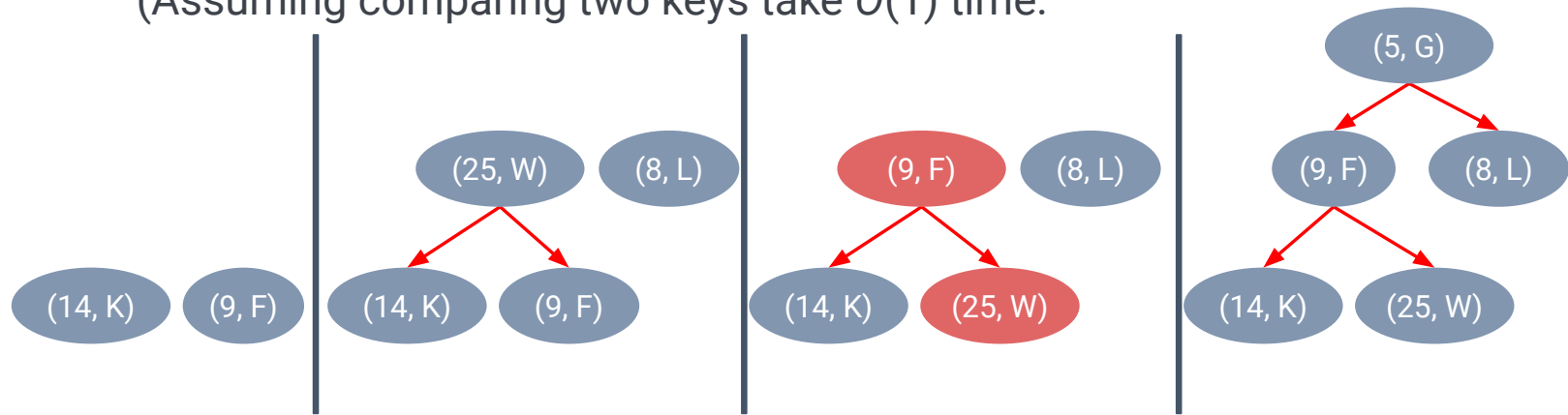
n denotes the number of elements or nodes.
The height of heap is $\log n$.

| Operation | Running Time (unsorted list) | Running Time (sorted list) | Running Time (Binary Heap) |
|-----------------|---------------------------------|-------------------------------|-------------------------------|
| P.add(k, v) | $O(1)$ | $O(n)$ | $O(\log n)$ |
| P.remove_min() | $O(n)$ | $O(1)$ | $O(\log n)$ |
| P.min() | $O(n)$ | $O(1)$ | $O(1)$ |
| P.is_empty() | $O(1)$ | $O(1)$ | $O(1)$ |
| len(P) | $O(1)$ | $O(1)$ | $O(1)$ |

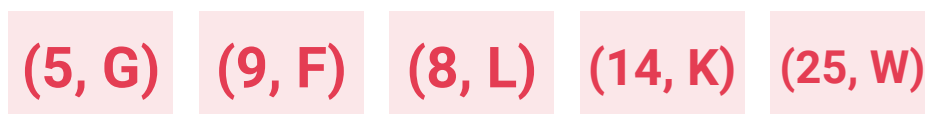
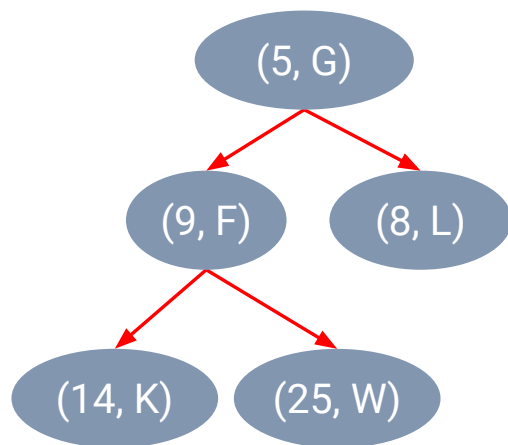
Binary Heap Consideration



- If start with an empty heap, calling add operations n successive times will run in $O(n \log n)$ time - top-down approach.
- Alternatively, bottom-up construction method runs in $O(n)$ time (Assuming comparing two keys take $O(1)$ time).

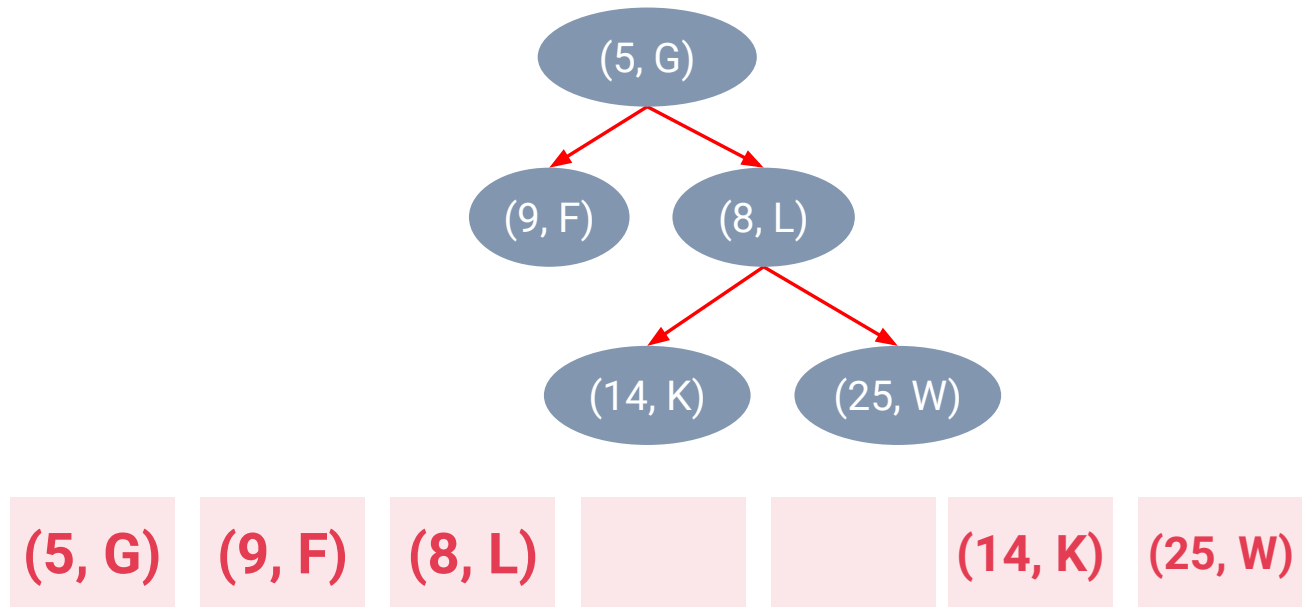


Binary Heap Implementation in Array



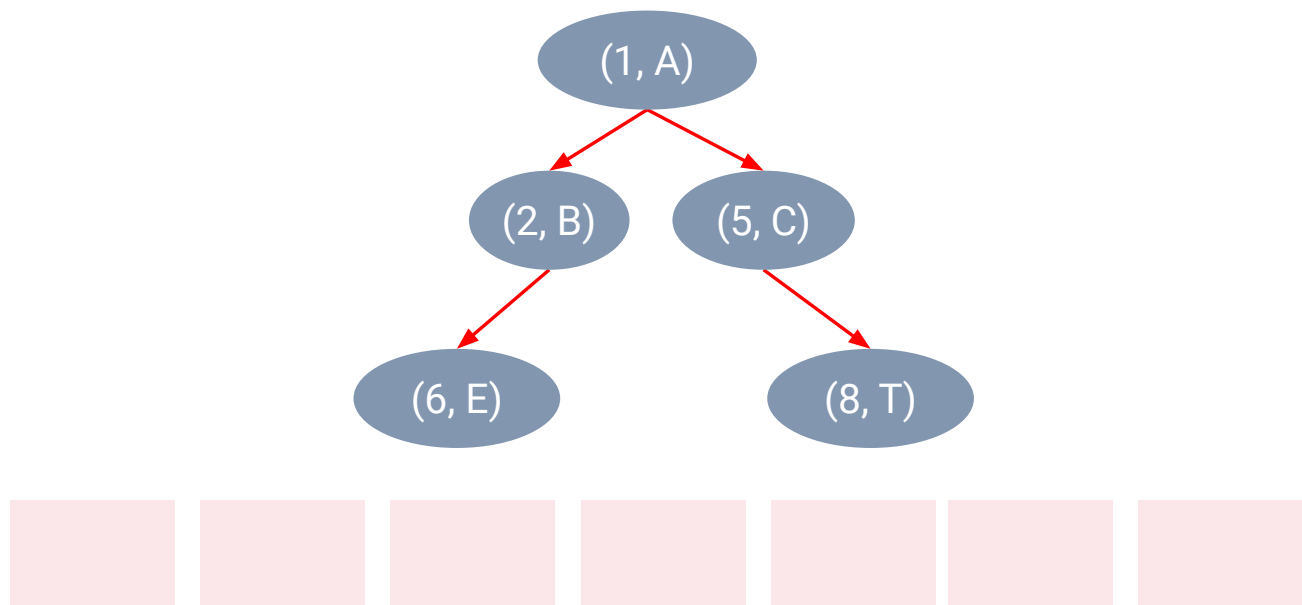
Binary Heap Implementation in Array

31



Exercise

32



Individual Assignment



- Assignment#5: Trees
- Due 09.00 am, Tuesday 15/09/2020.
- Submission
 - Email: sirasit@it.kmitl.ac.th (PDF format preferred)
 - Paper: in classroom next week
- Can be either written by hand or typing.
- **Make sure to submit on time!!**
 - Late submission has penalty on the score.
- If unable to submit on time for reasonable reasons, let me know asap.