

Priority Queues Continued...



HEAPS

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- When using an unsorted list to store entries, we can perform **insertions in $O(1)$** time, but **finding or removing** an element with minimum key requires an **$O(n)$** -time loop through the entire collection.
- If using a sorted list, we can trivially **find or remove the minimum** element in **$O(1)$** time, but **adding** a new element to the queue may require **$O(n)$** time to restore the sorted order.

HEAPS

When using an unsorted list to store entries, we can perform
insertions in $O(1)$ time,
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finding or removing an element with minimum key requires
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HEAPS

- In contrast, if using a sorted list, we can trivially **find or remove** the minimum element in $O(1)$ time, but **adding a new element** to the queue may require $O(n)$ time to restore the sorted order.

Heaps

- In this section, we provide a more efficient realization of a priority queue using a data structure called a **binary heap.**
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Heap

- A heap is a tree-based structure,
- A binary heap only specifies the relationship between a parent and its children.
- For a min-heap, a node must be less than all of its children and it, in turn, must be greater than its parent (if any).
- Thus, a binary min-heap is a binary tree that satisfies the min-heap property.

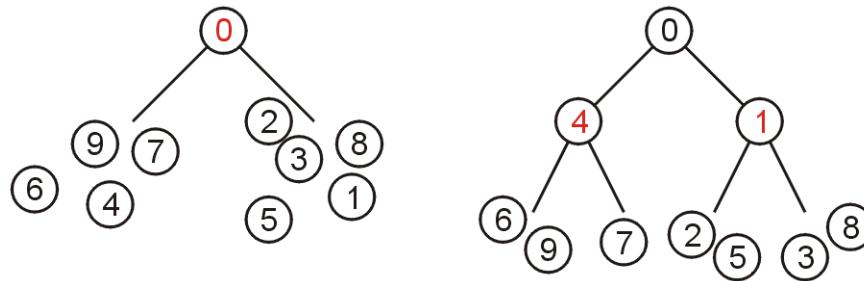
Important: there is no other relationship between the children of a node other than they are all greater than their common parent. The failure to comprehend this has previously been the greatest source of errors.

Min Heaps

Definition

A non-empty binary tree is a min-heap if

- The key associated with the root is less than or equal to the keys associated with either of the sub-trees (if any)
 - Both of the sub-trees (if any) are also binary min-heaps



From this definition:

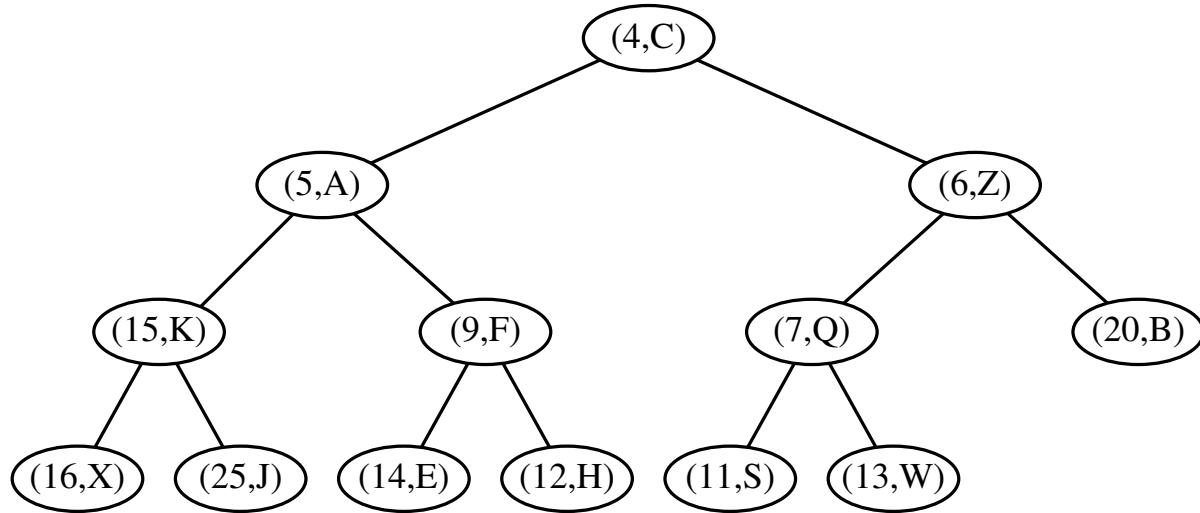
- A single node is a min-heap
 - All keys in either sub-tree are greater than the root key

BST vs Binary Heaps

Binary Search Tree	Binary Heap
<p>Given a node:</p> <p>All objects in the left sub-tree less than the node,</p> <p>All objects in the right sub-tree are greater than the node, and both sub trees are also a binary search tree.</p>	<p>Given a node:</p> <p>All strict descendants are greater than the node,</p> <p>And both sub-trees are also binary heaps.</p>

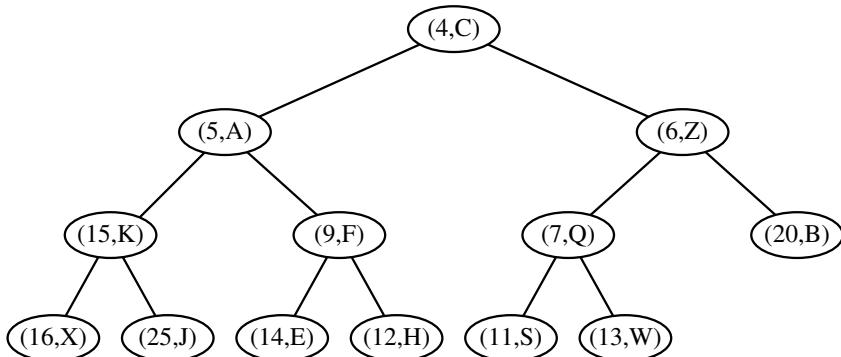
Implementing the Heap Structure

The Heap Data Structure with the key value pair



Example of a heap storing 13 entries with integer keys. The last position is the one storing entry (13,W).

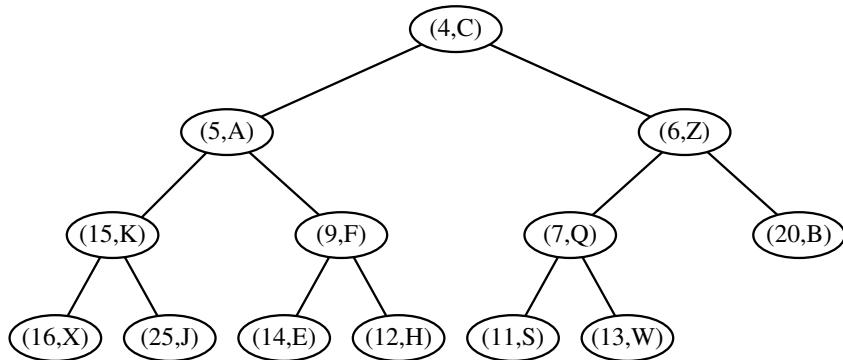
The Heap Data Structure



- This binary tree satisfies 2 additional properties
 - Relational property (definition of the min heap as discussed earlier)
 - Structural property
- **The relational property** is : In a heap T , for every position p other than the root, the key stored at p is greater than or equal to the key stored at p's parent.

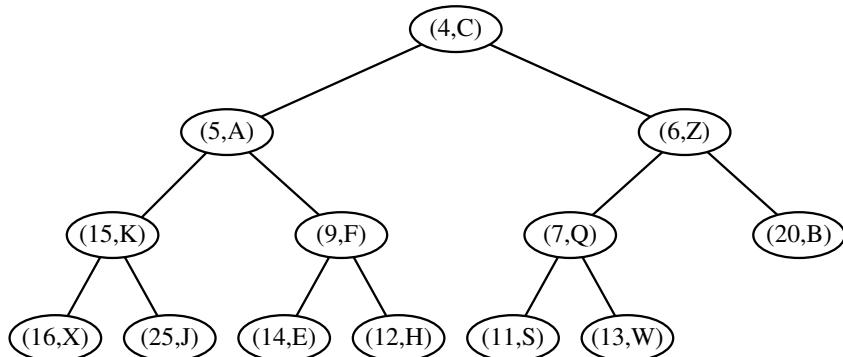
This relational property is the **Heap-Order Property itself.**

The Heap Data Structure



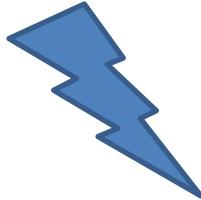
- This binary tree satisfies 2 additional properties
 - Relational property
 - Structural property
- **The structural property** is :
The binary tree must be **complete**.

The Height of a Heap



- Let h denote the height of T .
Insisting that T be **complete** :
- A heap T storing n entries has height

$$h = \lfloor \log n \rfloor$$



**Remember : Array Based Representation of
a Complete Binary Tree**

Array Based Representation of a Complete Binary Tree

- The array-based representation of a binary tree is especially suitable for a complete binary tree T .
- We recall that in this implementation, the elements of T are stored in an array-based list A such that the element at position p in T is stored in A with index equal to the level number $f(p)$ of p , defined as follows:

(4,C)	(5,A)	(6,Z)	(15,K)	(9,F)	(7,Q)	(20,B)	(16,X)	(25,J)	(14,E)	(12,H)	(11,S)	(8,W)
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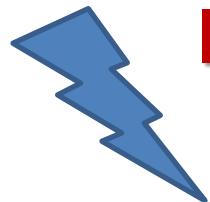
Array Based Representation of a Complete Binary Tree

(4,C)	(5,A)	(6,Z)	(15,K)	(9,F)	(7,Q)	(20,B)	(16,X)	(25,J)	(14,E)	(12,H)	(11,S)	(8,W)
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- If p is the root of T , then $f(p)=0$. If p is the left child of position q , then $f(p) = 2f(q)+1$.
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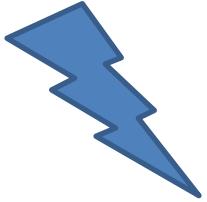
What is the index value for (9,F)'s left child?

Implementing a Priority Queue with a Min Heap



Implementing a Priority Queue with a Heap Design Decisions

- We will use and store **<key ,value>** pairs as items in the heap.
- The **len** and **is empty** methods can be implemented based on examination of the tree, and
- the **min** operation is equally trivial because the heap property assures that the element at the root of the tree has a minimum key.
- The interesting algorithms are those for implementing the **add** and **remove min** methods.



Adding an Item to the Heap

- Let us consider how to perform **add(k,v)** on a priority queue implemented with a heap T .
- We store the pair (k,v) as an item at a new node of the tree.**
 - To maintain the **complete binary tree property**,
 - that new node should be placed at a position p just beyond the rightmost node at the bottom level of the tree,
 - or as the leftmost position of a new level, if the bottom level is already full (or if the heap is empty).

However as demonstrated earlier Executing Step 1 may cause a violation on **heap-order property**.



Adding an Item to the Heap Up Heap Bubbling (Percolate Up)

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Executing Step 1 may cause a violation on **heap-order property**.

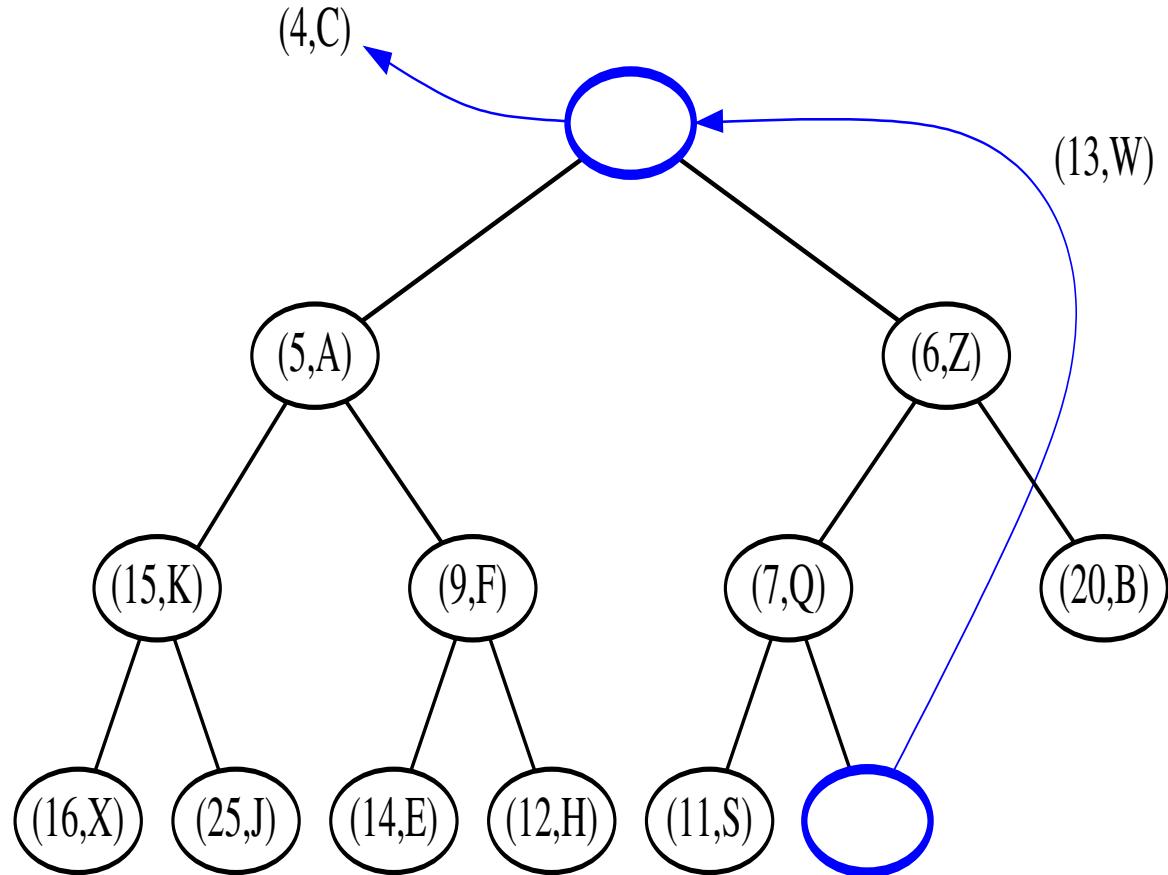
We must apply : Up heap bubbling (percolate up) as shown earlier in simulation slides.

Removing the Item with Min key

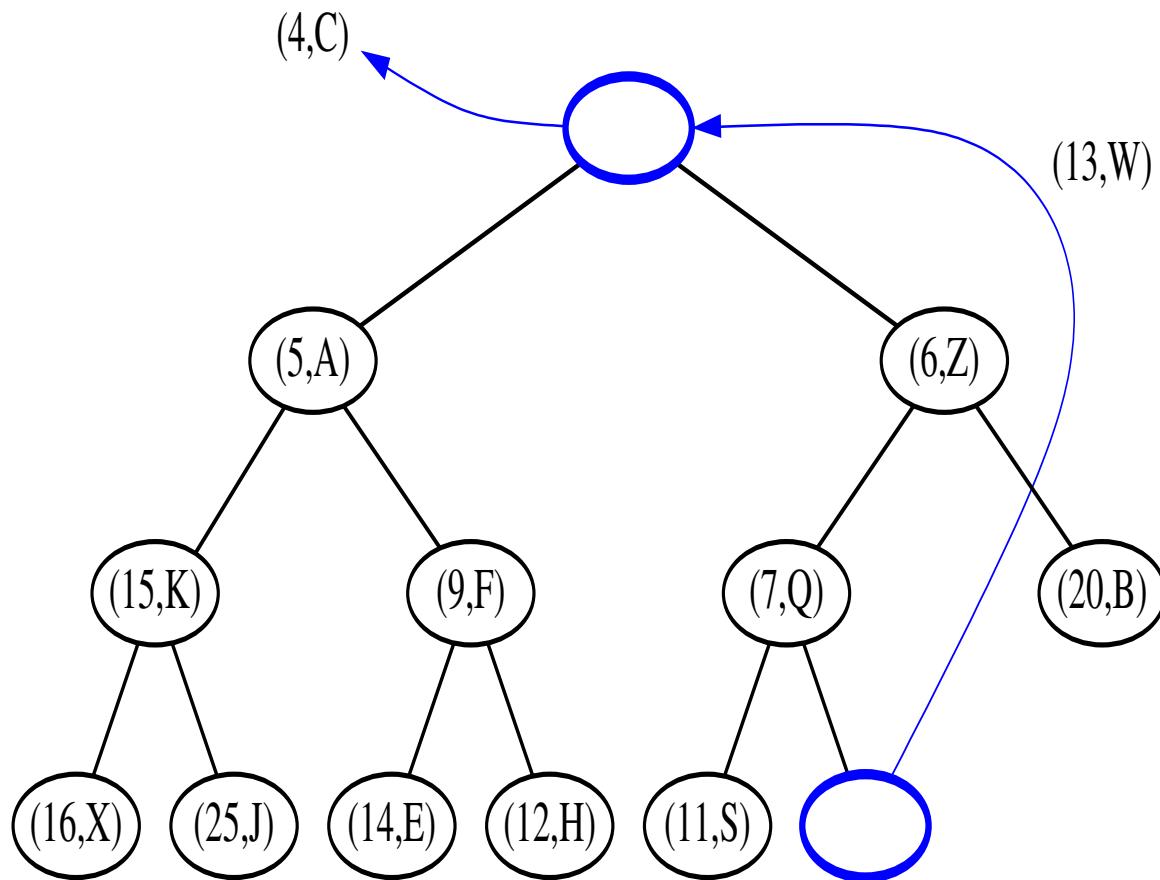
Down Heap Bubbling

- The min element resides at the root so when we remove that:
 - We must ensure that the shape of the heap respects the complete binary tree property by deleting the leaf at the last position p of T , defined as the rightmost position at the bottommost level of the tree.
 - To preserve the item from the last position p , we copy it to the root r (in place of the item with minimum key that is being removed by the operation).
 - Just simply satisfying the tree is complete not good enough, it must remain as a min heap therefore we must find the accurate place for that child that replaced the root.

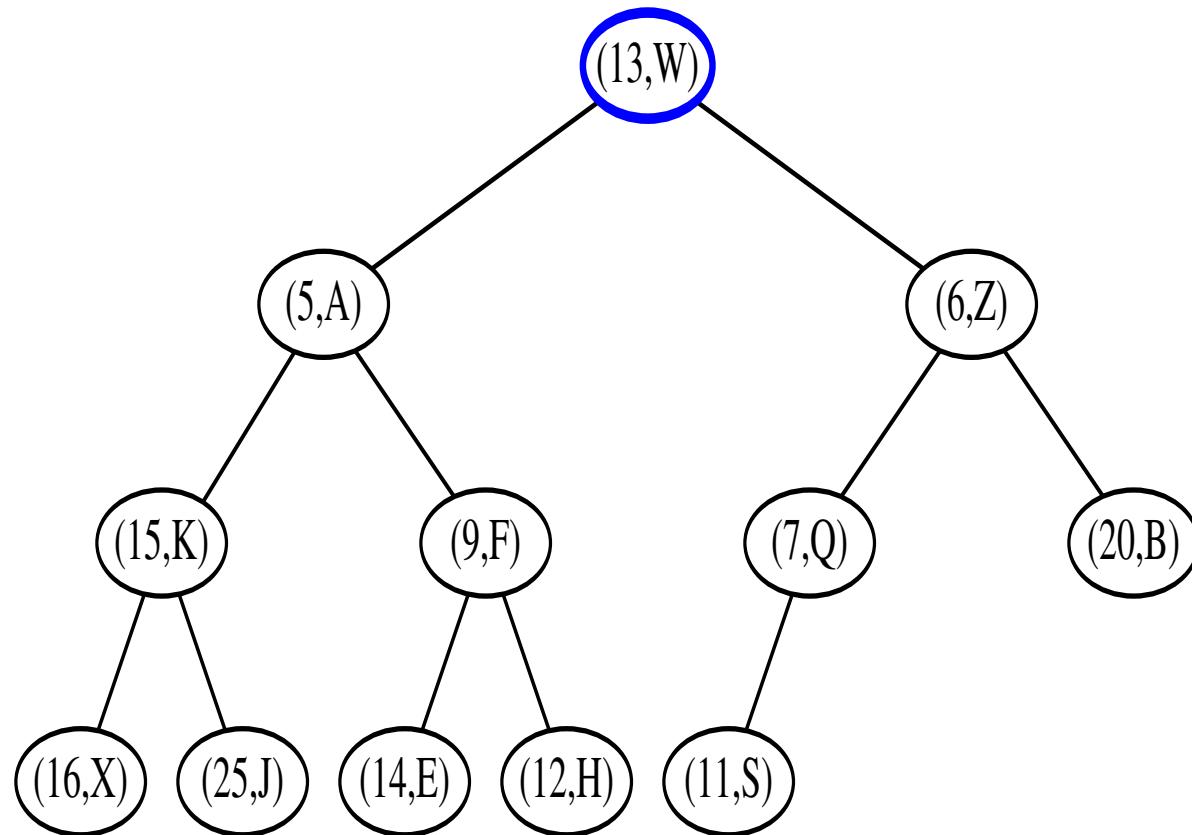
Let's work on remove
**How do we remove an element and keeping
at a complete tree at the same time?**



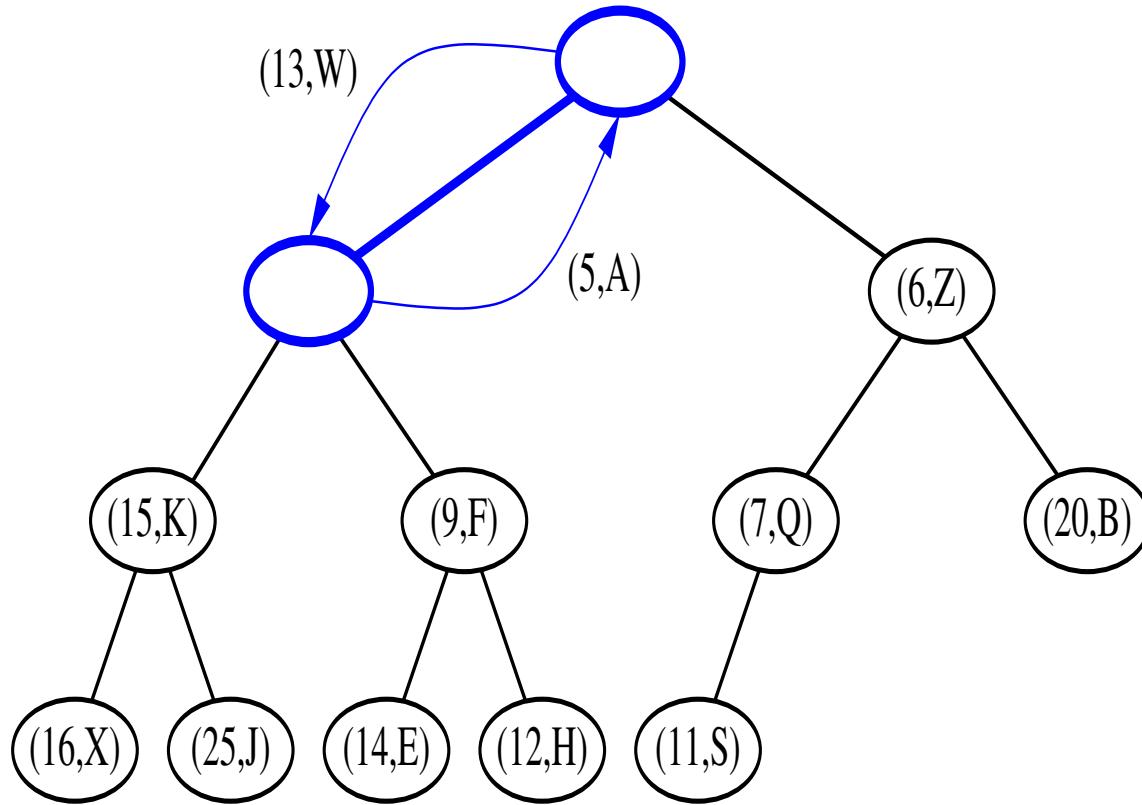
Removing the Item with Min key



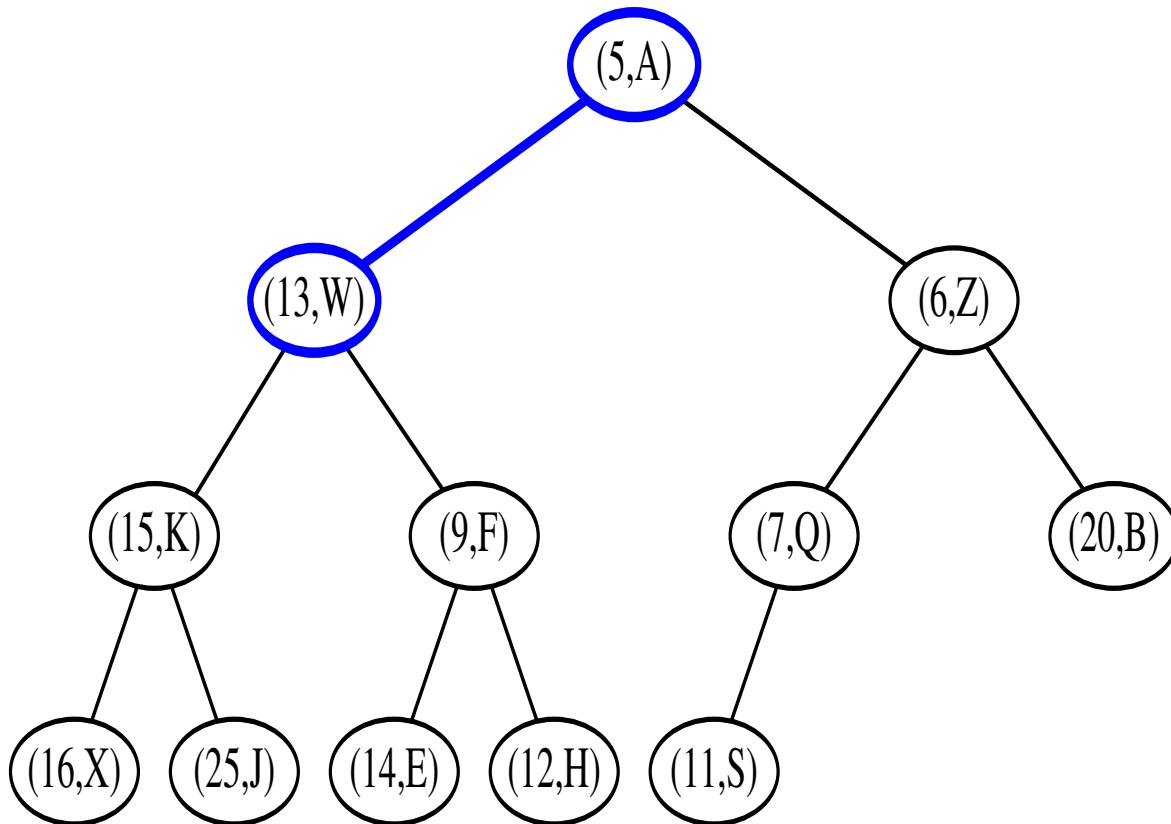
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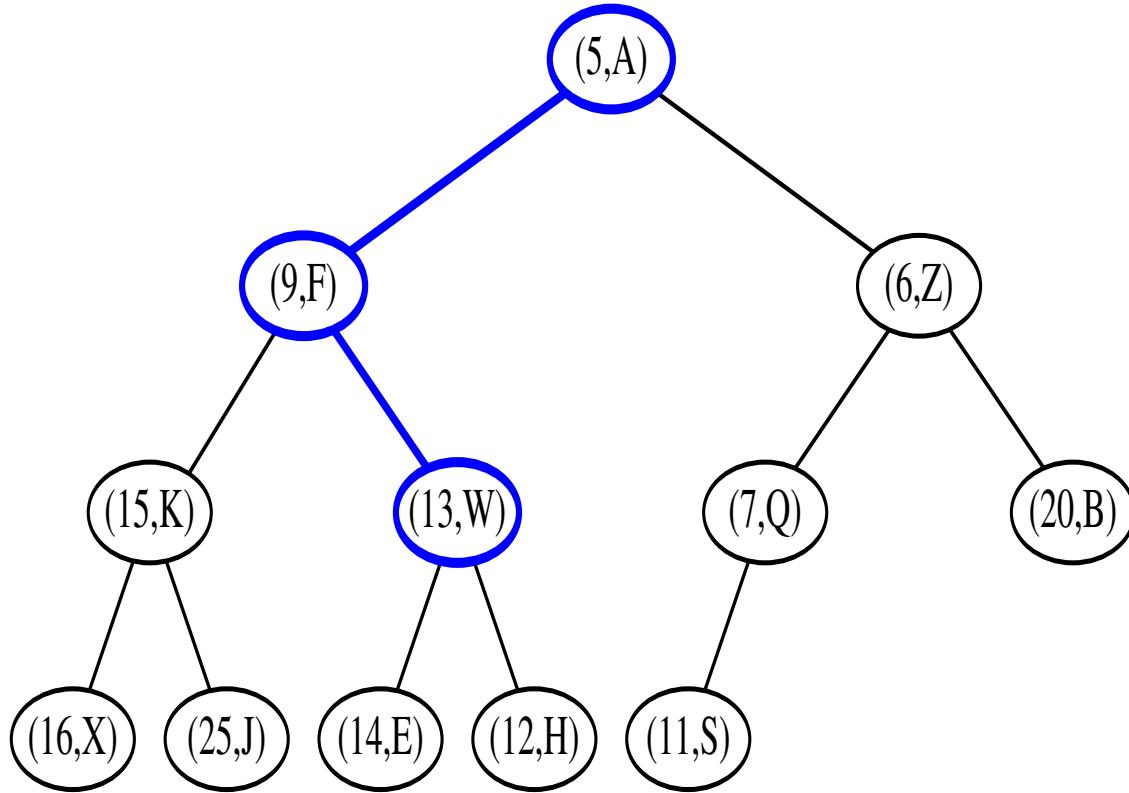
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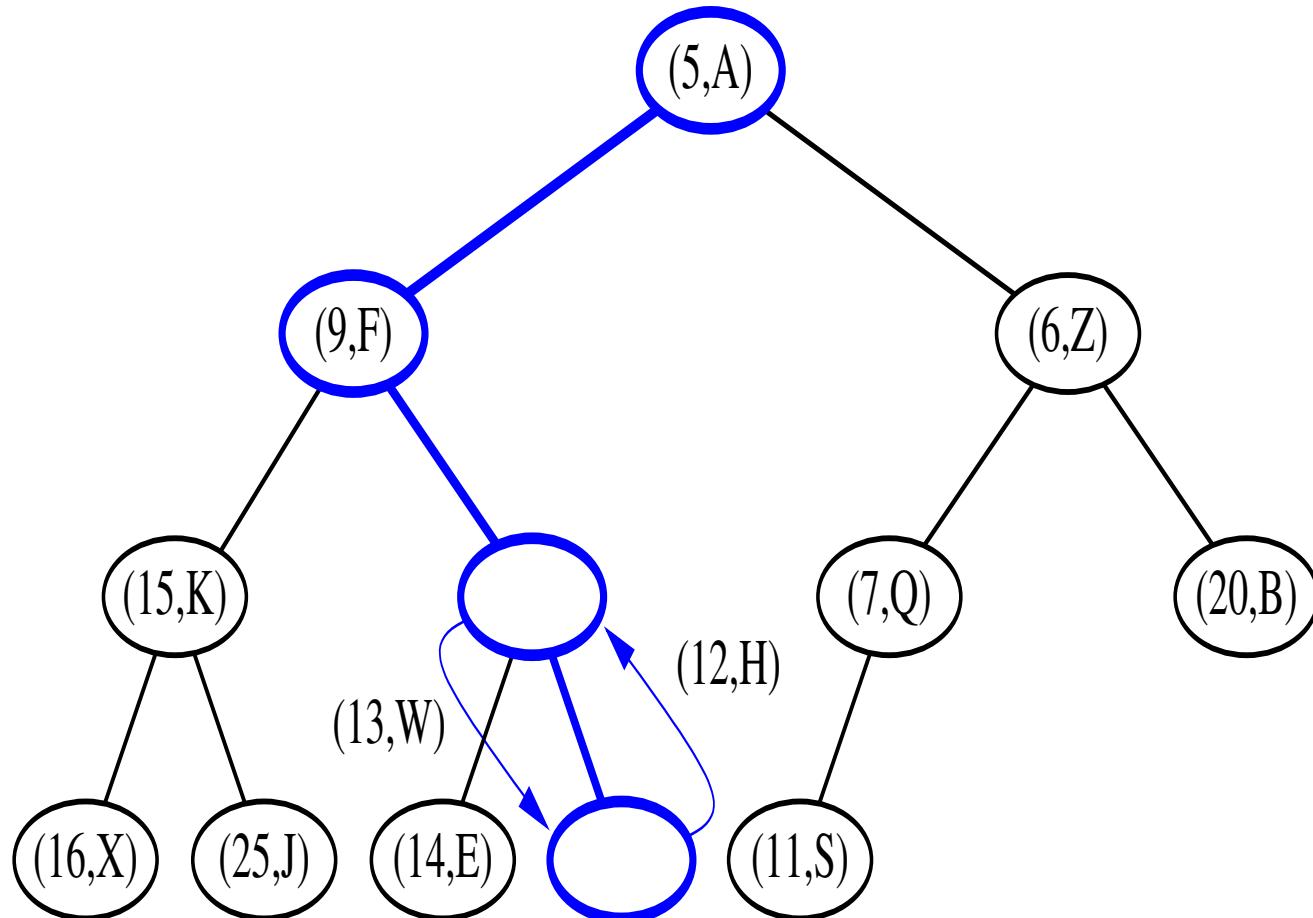
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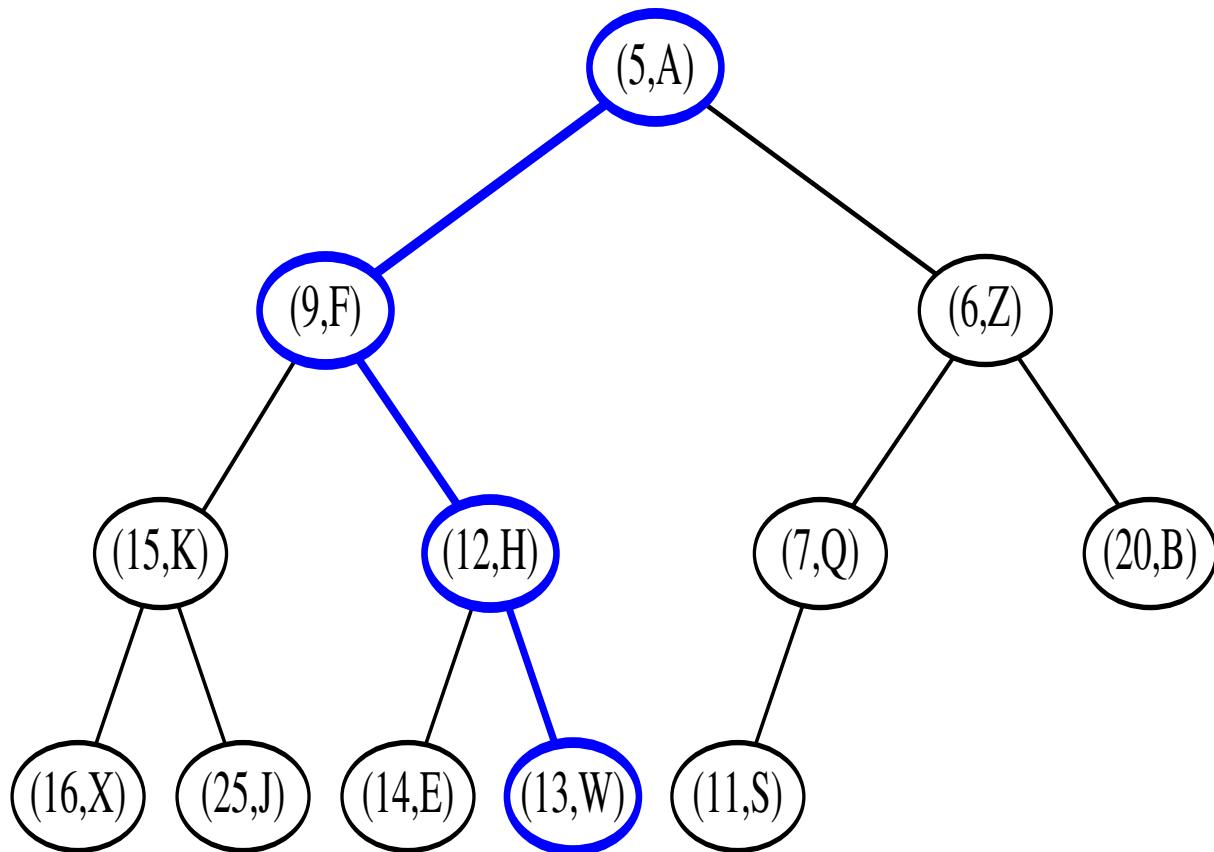
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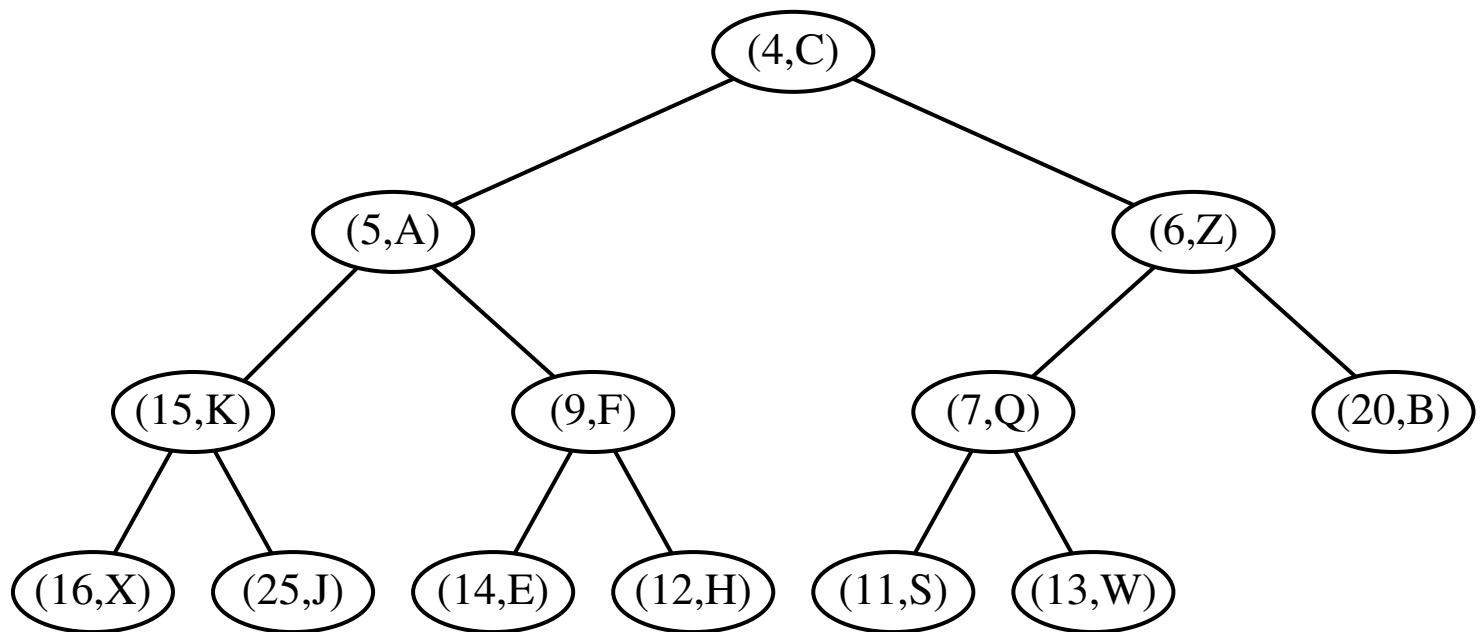
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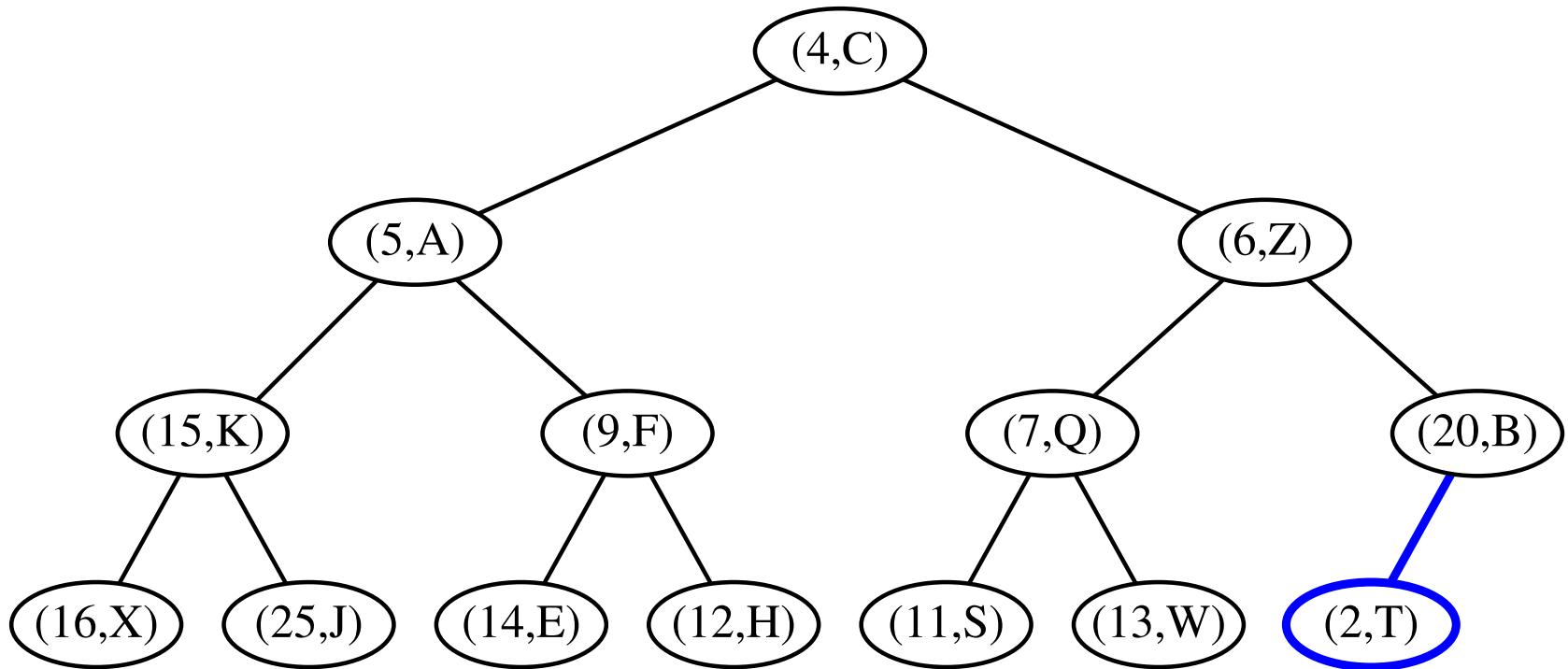
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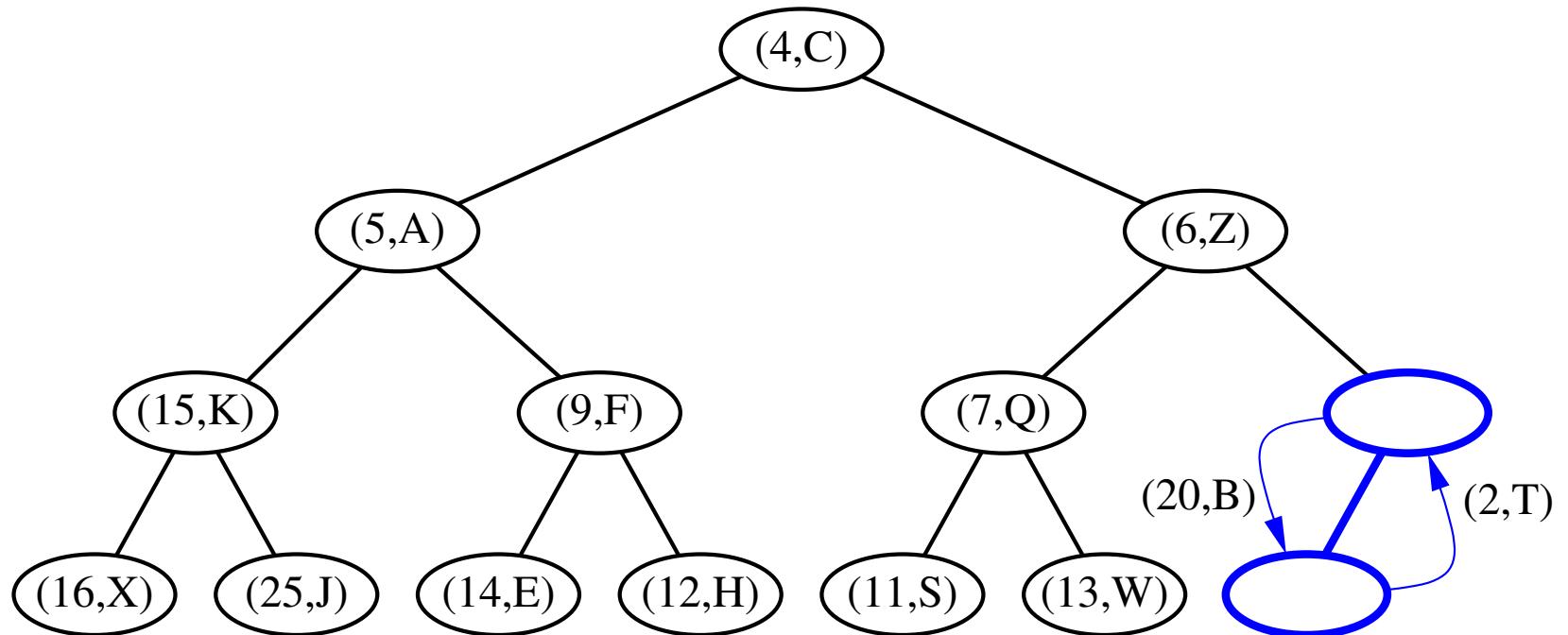
Adding a new item to Heap : Up heap Bubbling (percolate up)



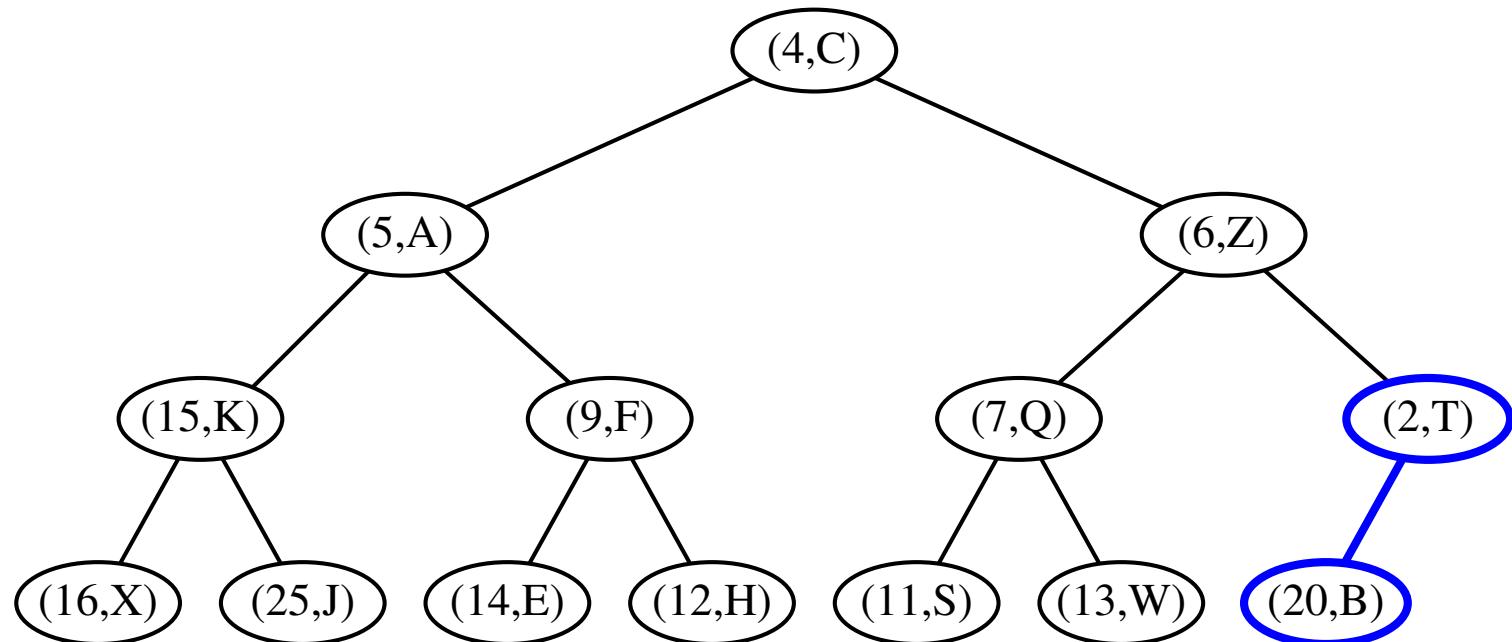
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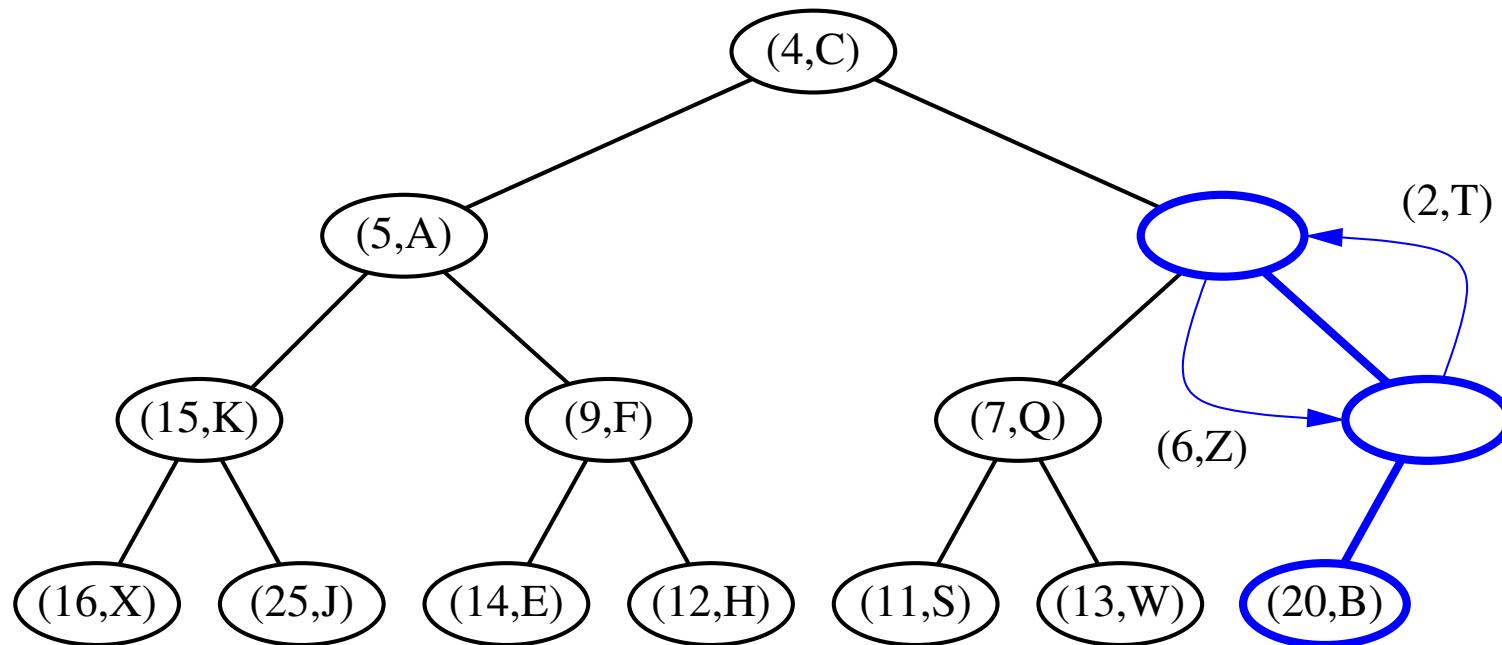
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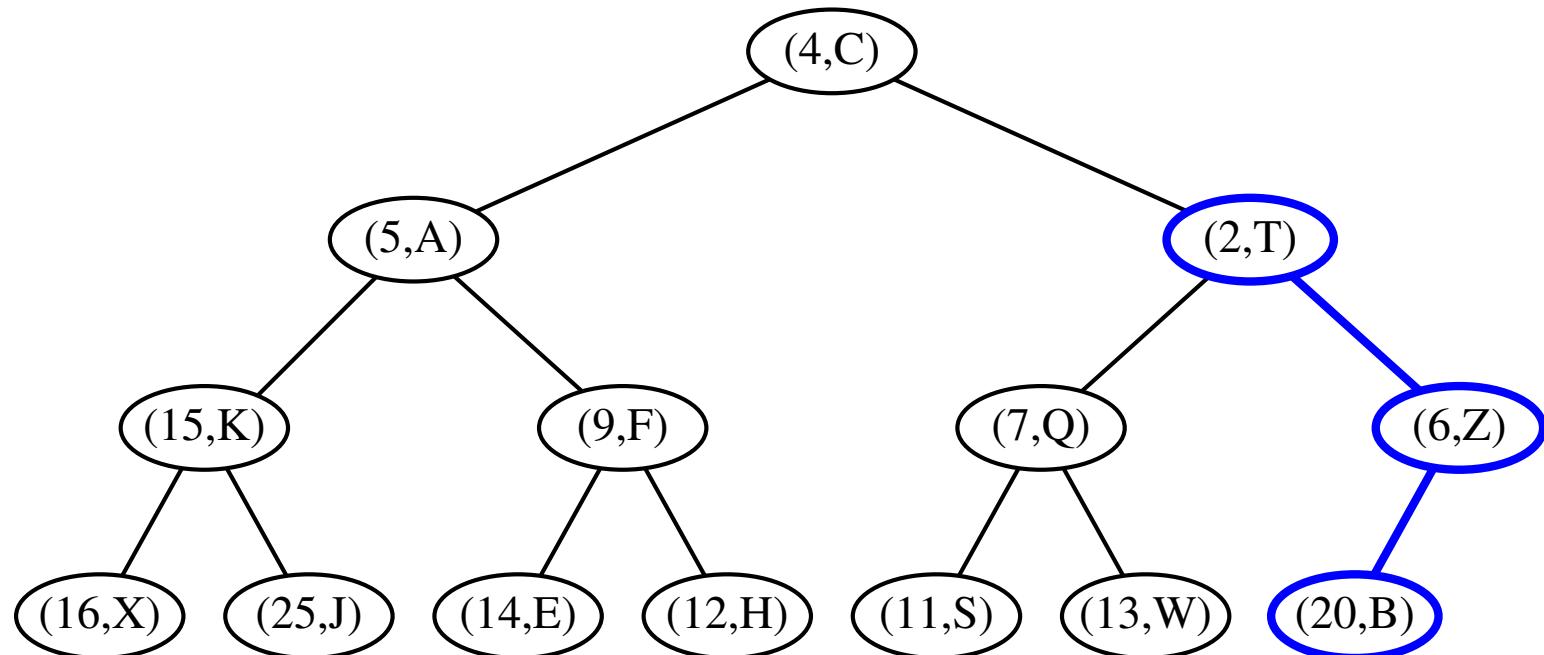
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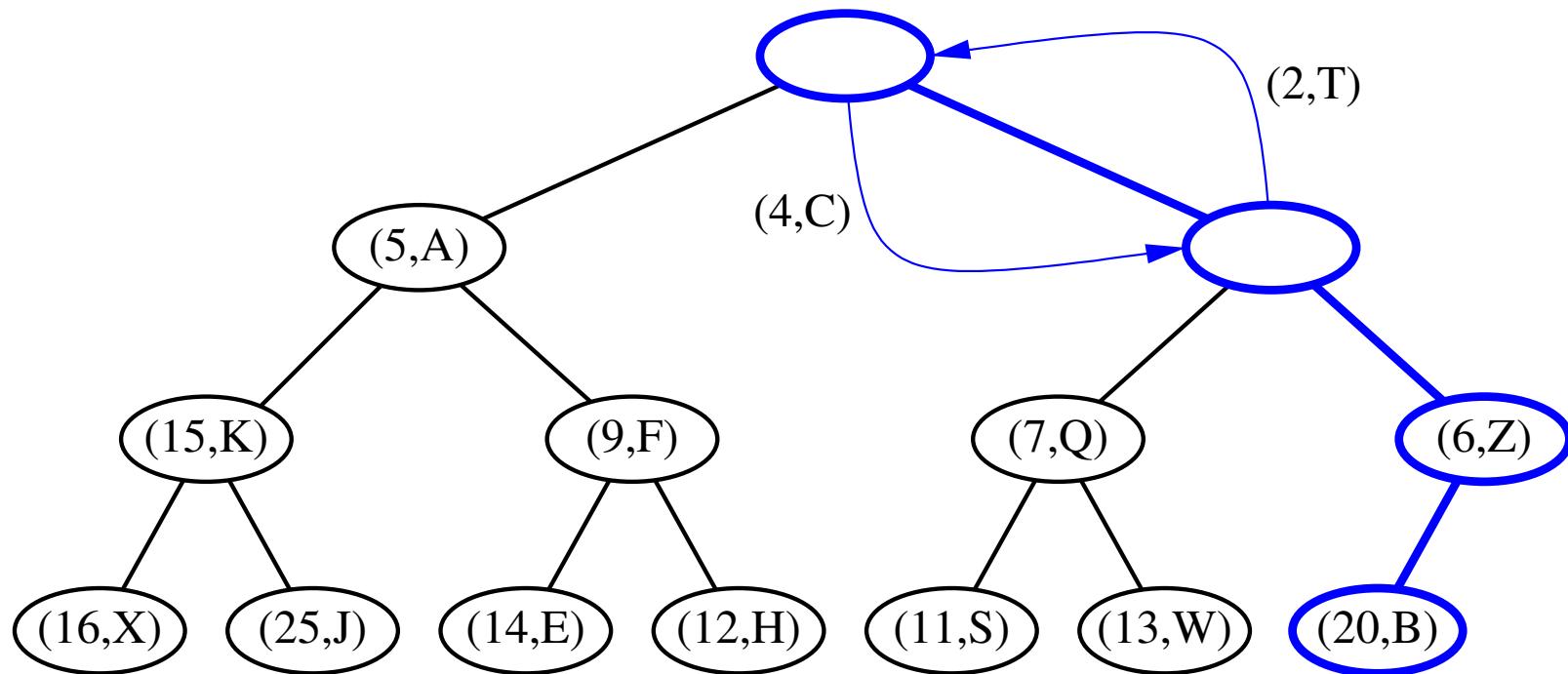
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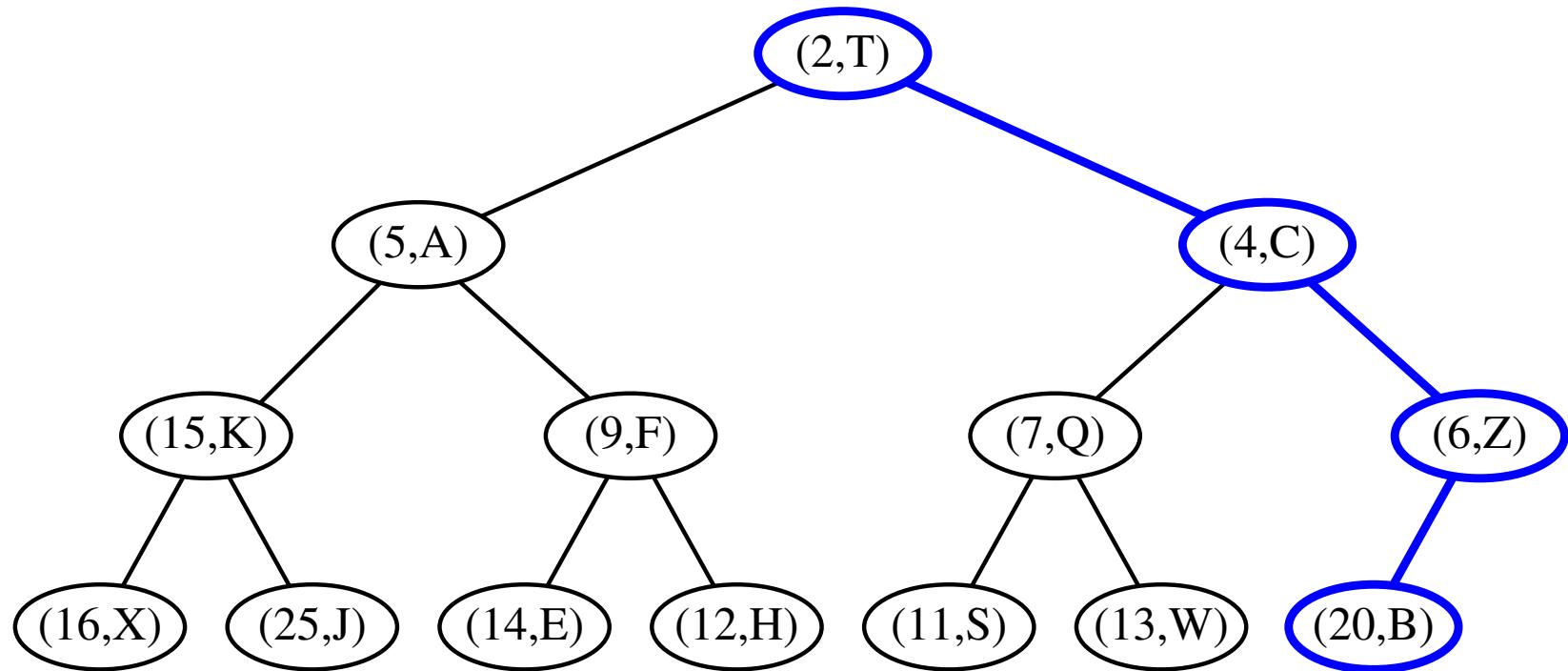
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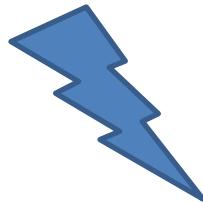
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Adding a new item to Heap : Up heap Bubbling (percolate up)



**Before we implement our P.Queue using a
min heap**



**Remember : Array Based Representation of
a Complete Binary Tree**

Array Based Representation of a Complete Binary Tree

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Recall that we are using an Array Based Representation of a Complete Binary Tree

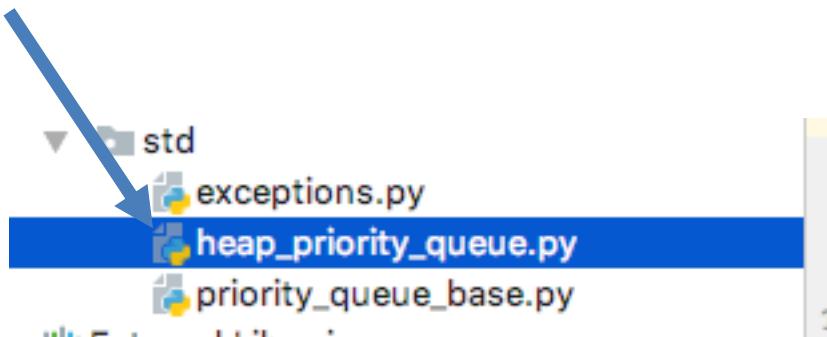
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0	1	2	3	4	5	6	7	8	9	10	11	12

Let's code

GO TO D2L

- Download the Lecture incomplete Python code.
- Start up Pycharm and copy the py files under a new project.
- Go to



- Complete `_parent`, `_left` and `_right` functions

Constructors

```
#----- public behaviors -----
```

```
def __init__(self):
    """Create a new empty Priority Queue."""
    self._data = []

def __len__(self):
    """Return the number of items in the priority queue."""
    return len(self._data)
```

Parent, left and right

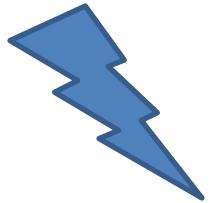
```
def _parent(self, j):  
    return (j-1) // 2  
#-----  
def _left(self, j):  
    return 2*j + 1  
#-----  
def _right(self, j):  
    return 2*j + 2
```

Why are we tapping into implementing a priority queue using an array-based heap ?

- Implementing a priority queue using an array-based heap representation allows us to avoid some complexities of a node-based tree structure.
- In particular, the **add and remove min** operations of a priority queue both **depend on locating the last index of a heap of size n.**
- **With the array-based representation, the last position is at index n – 1 of the array.**
- Locating the last position of a complete binary tree implemented with a linked structure requires more effort.

Why are we tapping into implementing a priority queue using an array-based heap ?

- Also
- If the size of a priority queue is not known in advance, use of an array-based representation does introduce the need to dynamically resize the array on occasion, as is done with a Python list.
- *The space usage of such an array-based representation of a complete binary tree with n nodes is $O(n)$, and the time bounds of methods for adding or removing elements become amortized.*



Finally: Python Heap Implementation

Class: HeapPriorityQueue

```
from priority_queue_base import PriorityQueueBase  
from exceptions import Empty
```

inheritance

```
class HeapPriorityQueue(PriorityQueueBase): # base class defines _Item  
    """A min-oriented priority queue implemented with a binary heap."""
```

----- nonpublic behaviors -----

```
def _parent(self, j):  
    return (j - 1) // 2
```

```
def _left(self, j):  
    return 2 * j + 1
```

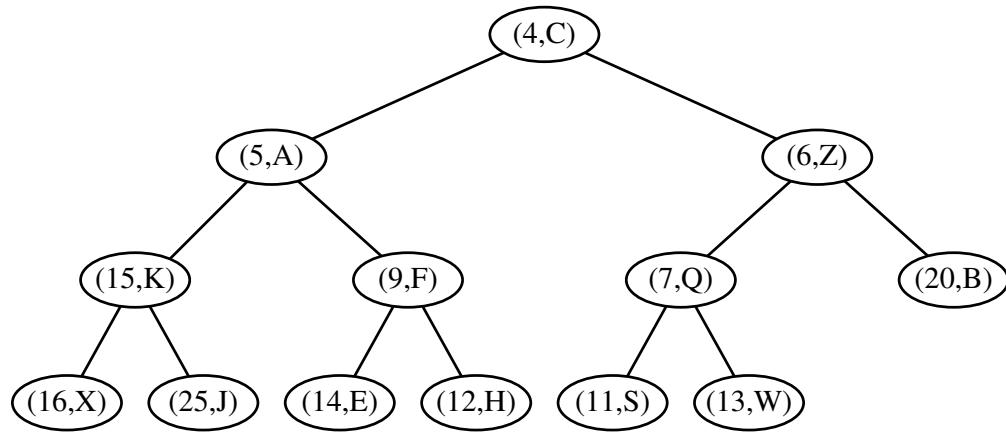
```
def _right(self, j):  
    return 2 * j + 2
```

```
def _has_left(self, j):  
    return self._left(j) < len(self._data) # index beyond end of list?
```

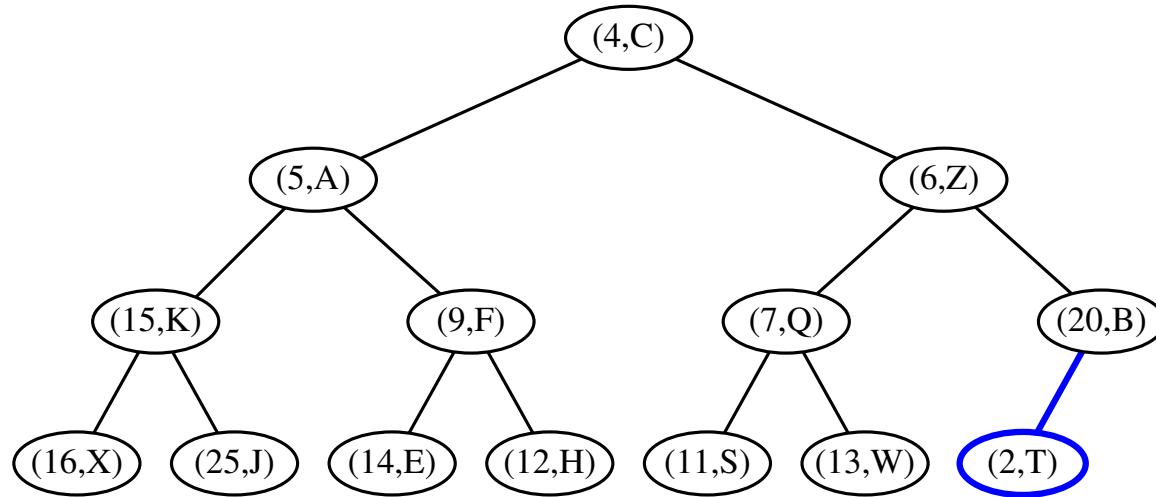
```
def _has_right(self, j):  
    return self._right(j) < len(self._data) # index beyond end of list?
```

Let's implement **add**
which means we must implement **upheap**
bubbling (percolate up)!

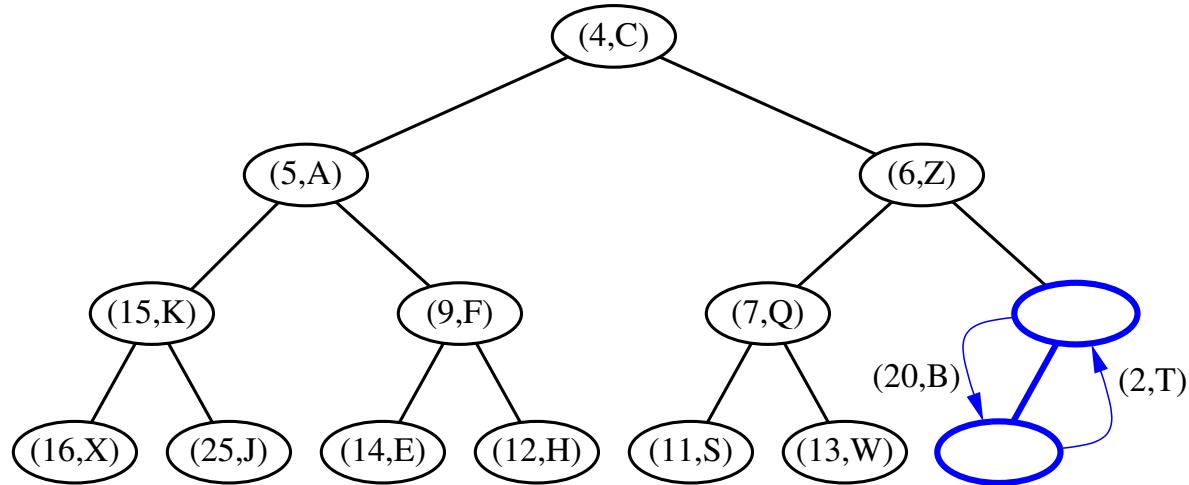
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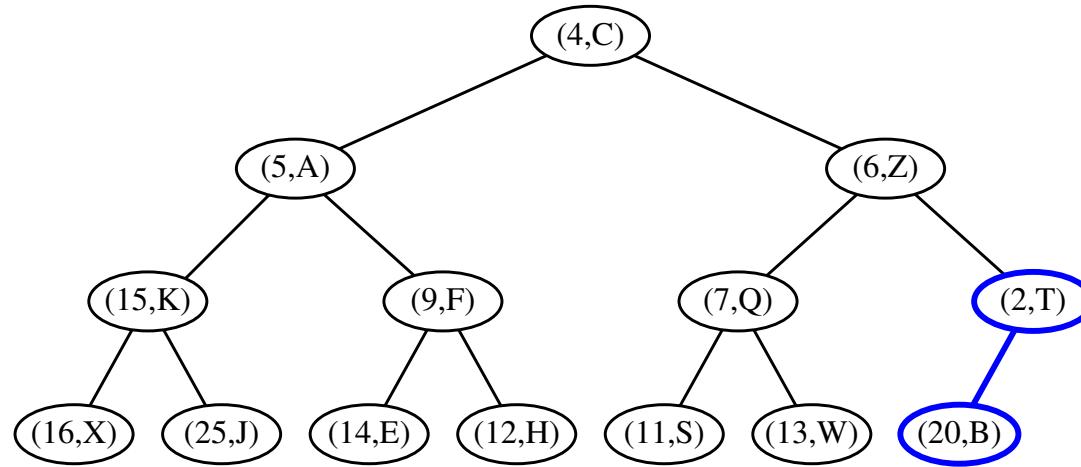
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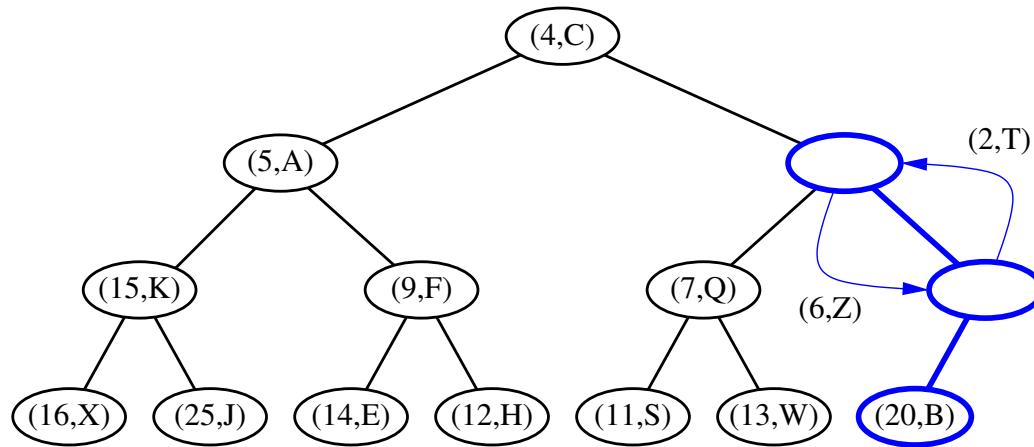
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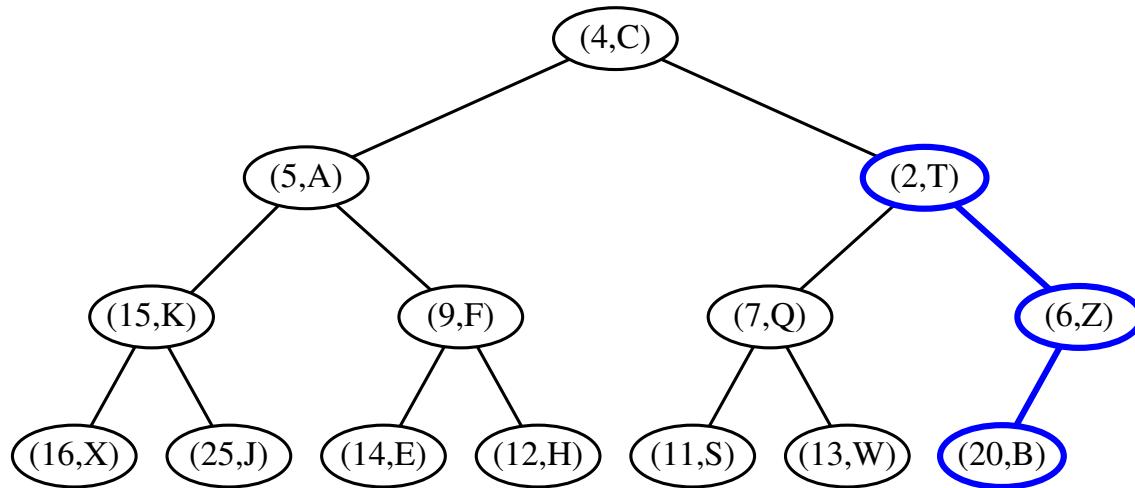
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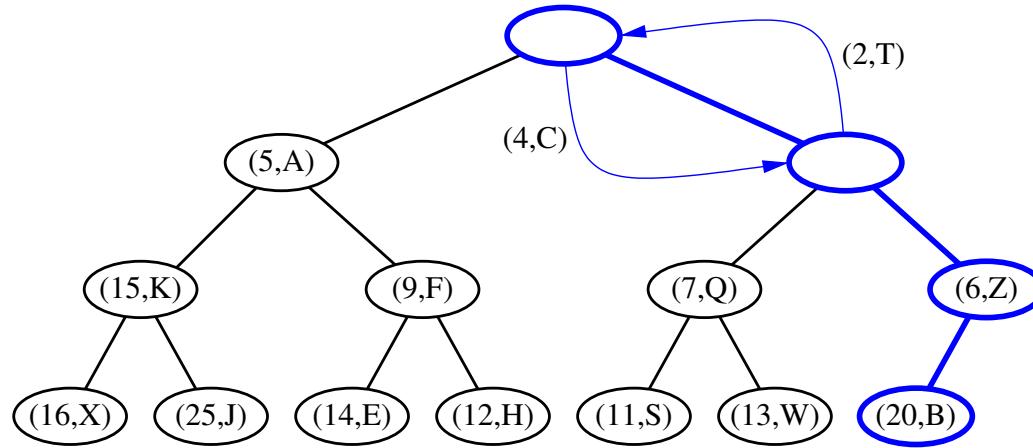
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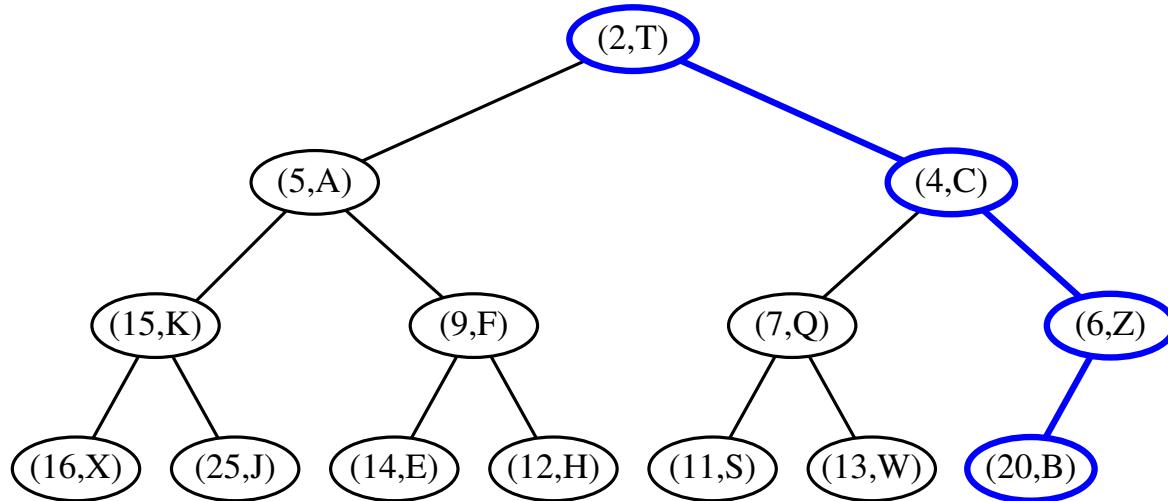
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Adding a new item to Heap : Up heap Bubbling (percolate up)



Adding a new item to Heap : Up heap Bubbling (percolate up)



Step 1 implement **upheap** → used in **add**

Complete the upheap bubbling
upheap bubbling : non public method will be used
during add

Program this!

```
def _swap(self, i, j):
```

""Swap the elements at indices i and j of array.""""

```
def _upheap(self, j):
```

#local variable **parent** gets this object's parent j th index

check to see: **j > 0** also this object's data[j] is less than this object's data[parent]:

#then swap(j, parent)

recur at position of parent

Completed version

upheap bubbling : nonpublic method will be used during add

```
def _swap(self, i, j):
    """Swap the elements at indices i and j of array."""
    self._data[i], self._data[j] = self._data[j], self._data[i]

def _upheap(self, j):
    parent = self._parent(j)
    if j > 0 and self._data[j] < self._data[parent]:
        self._swap(j, parent)
        self._upheap(parent) # recur at position of parent
```

Step 2 implement add

Now Complete the add method

```
def add(self, key, value):
    """Append a key-value pair to the priority queue."""
    #append item( key value ) pair
    # upheap newly added position
```

Completed the add method

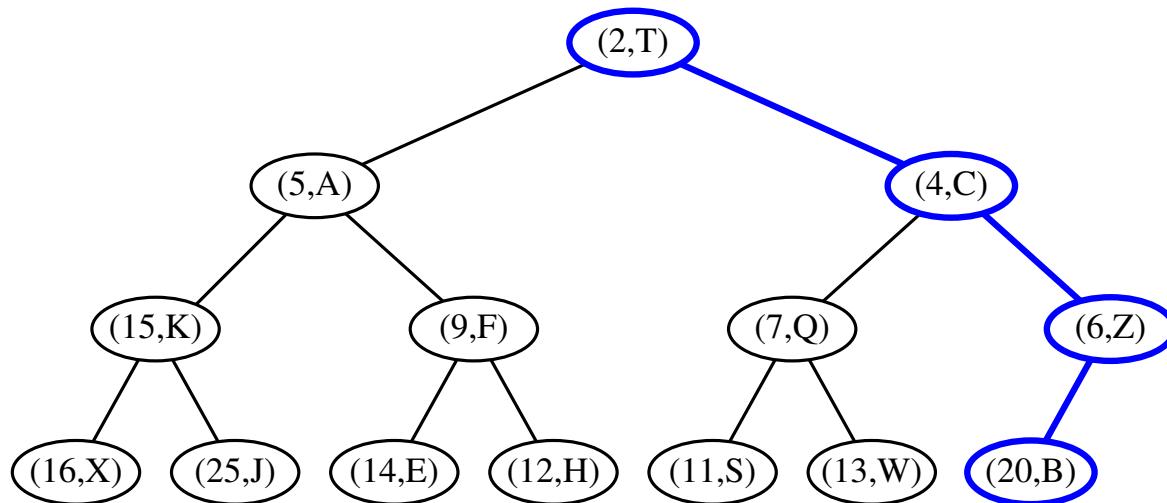
```
def add(self, key, value):
    """Add a key-value pair to the priority queue."""
    self._data.append(self._Item(key, value))
    self._upheap(len(self._data) - 1) # upheap newly added
position
```

Test Add method !

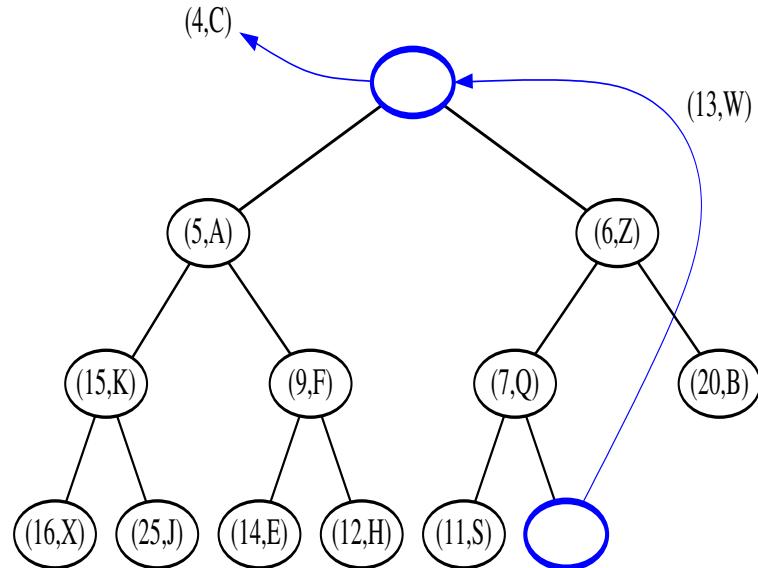
Test the add, use the break point

```
pqueu = HeapPriorityQueue()  
pqueu.add(5, 'A')  
pqueu.add(4, 'B')  
pqueu.add(3, 'B')  
pqueu.add(9, 'C')  
pqueu.add(3, 'B')  
pqueu.add(1, 'A')
```

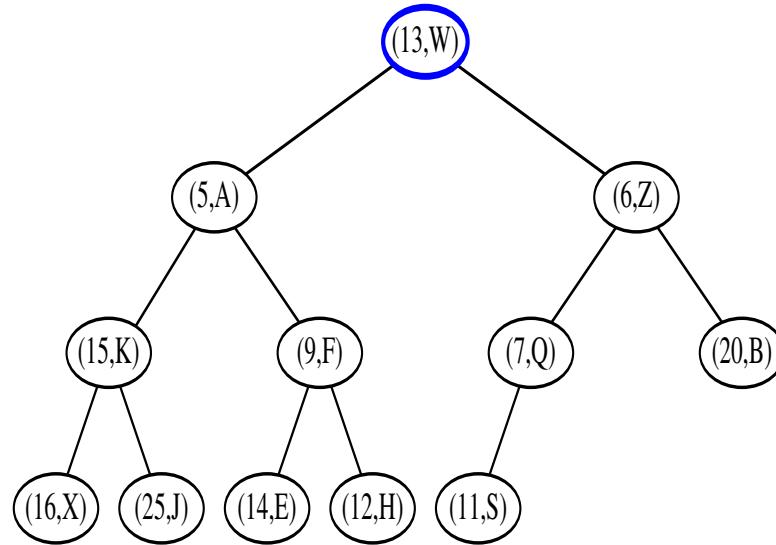
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**How do we remove an element and keeping
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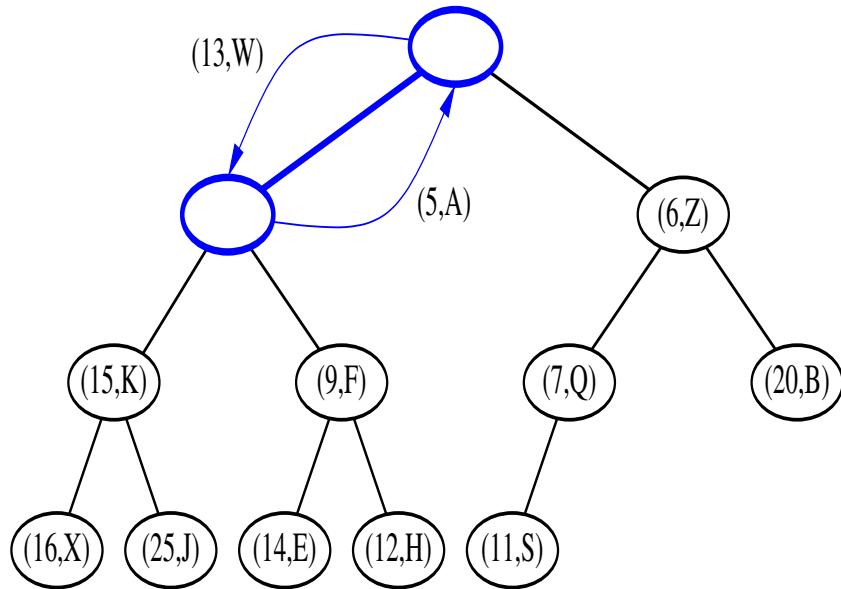
Removing the Item with Min key



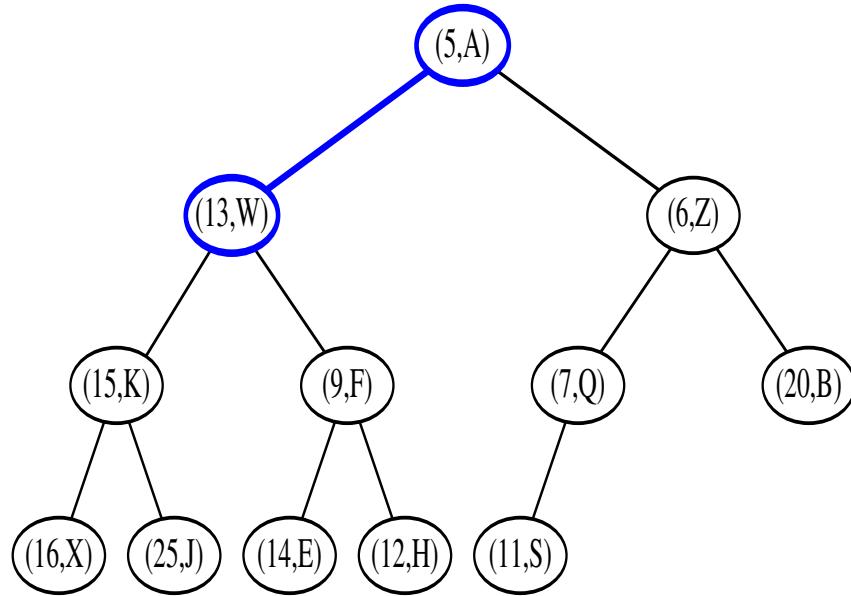
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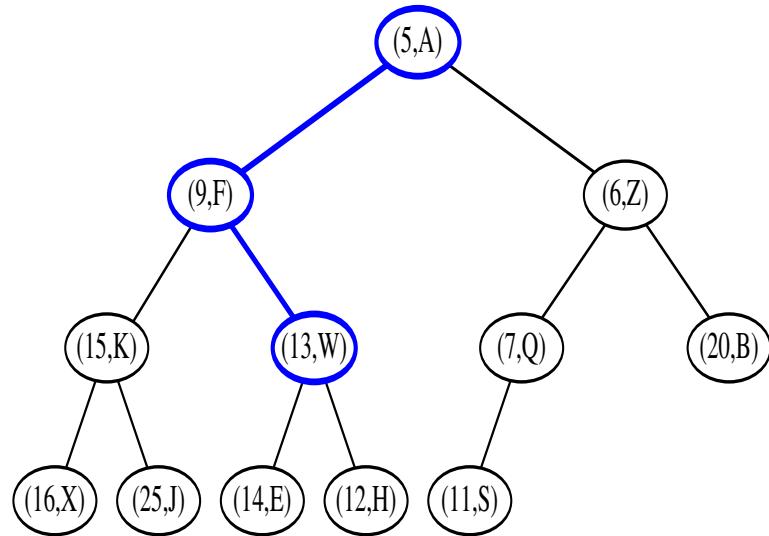
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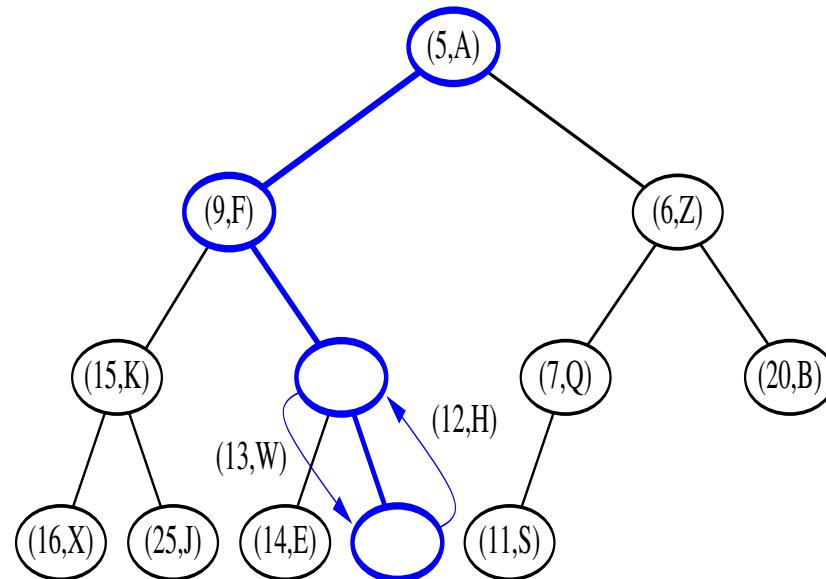
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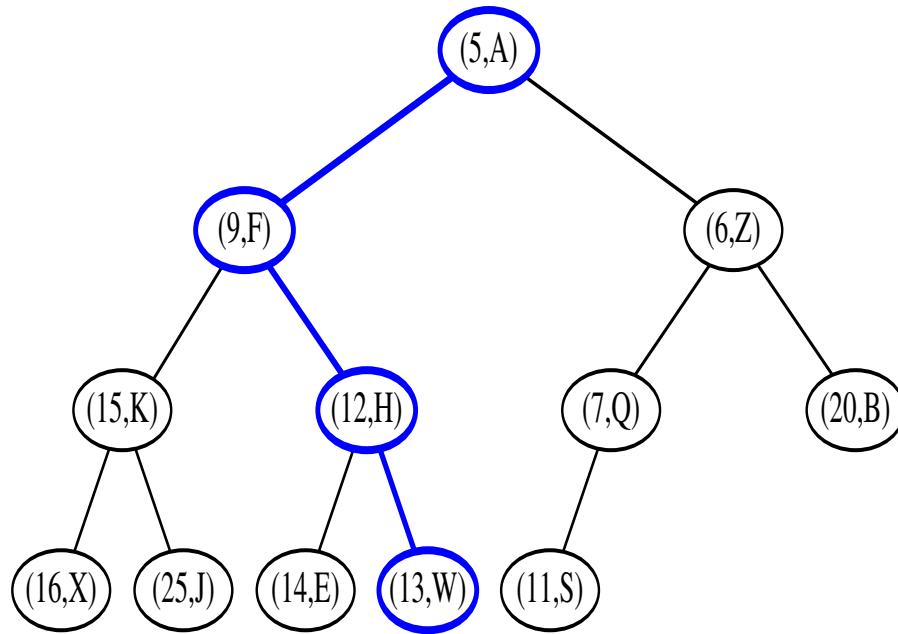
Removing the Item with Min key



Removing the Item with Min key



Removing the Item with Min key



Step 1 : **downheap** bubbling (percolate down) → used in **remove_min**

Complete the code for downheap bubbling

Complete

downheap bubbling : non public method

will be used during remove_min

```
def _downheap(self, j):  
  
    if current object has left at j :  
        then local variable left gets current object's left j  
        local variable small gets left # although right may be smaller  
    if current object has right at j:  
        then local variable right gets current object right j  
    if current object data at right index is less than < current data left index:  
        small gets right  
    if current data at small_child index is less than < current data j th index:  
        then swap j with small  
        current object downheap(small_child) # recur at position of small child
```

Completed version

downheap bubbling : non public method

will be used during remove_min

```
def _downheap(self, j):
    if self._has_left(j):
        left = self._left(j)
        small_child = left # although right may be smaller
    if self._has_right(j):
        right = self._right(j)
        if self._data[right] < self._data[left]:
            small_child = right
    if self._data[small_child] < self._data[j]:
        self._swap(j, small_child)
        self._downheap(small_child) # recur at position of small child
```

Step 2 : complete remove_min

Complete remove_min

```
def remove_min(self):
```

"""Remove and return (k,v) tuple with minimum key.

Raise Empty exception if empty.

"""

```
if current object is Empty:
```

```
    raise Empty('Priority queue is empty.')
```

```
    current object swap(0, len(self._data) - 1) # put minimum item at the  
end
```

and remove it from the list;

then fix new root

```
    return (item._key, item._value)
```

remove_min

```
def remove_min(self):
```

"""Remove and return (k,v) tuple with minimum key.

Raise Empty exception if empty.

"""

```
if self.is_empty():
```

raise Empty('Priority queue is empty.')

```
self._swap(0, len(self._data) - 1) # put minimum item at the  
end
```

item = self._data.pop() # and remove it from the list;

self._downheap(0) # then fix new root

```
return (item._key, item._value)
```

Test remove_min method !

Test remove_min method !

```
pqueu = HeapPriorityQueue()  
pqueu.add(5, 'A')  
pqueu.add(4, 'B')  
pqueu.add(3, 'B')  
pqueu.add(9, 'C')  
pqueu.add(3, 'B')  
pqueu.add(1, 'A')
```

```
print(str(pqueu.min()))  
pqueu.remove_min()  
print(str(pqueu.min()))
```

Complete min method

Complete min method

```
def min(self):
```

"""Return but do not remove (k,v) tuple with minimum key.

Raise Empty exception if empty.

"""

```
if current object is Empty:
```

```
    raise Empty('Priority queue is empty.')
```

Completed version min method

```
def min(self):
```

"""Return but do not remove (k,v) tuple with minimum key.

Raise Empty exception if empty.

"""

```
if self.is_empty():
```

```
    raise Empty('Priority queue is empty.')
```

```
item = self._data[0]
```

```
return (item._key, item._value)
```

Analysis of a Heap-Based Priority Queue

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- In short, each of the priority queue ADT methods can be performed in $O(1)$ or in $O(\log n)$ time, where n is the number of entries at the time the method is executed. The analysis of the running time of the methods is based on the following:
- The heap T has n nodes, each storing a reference to a key-value pair.
- The height of heap T is $O(\log n)$, since T is complete
- The min operation runs in $O(1)$ because the root of the tree contains such an element.
- Locating the last position of a heap, as required for add and remove min, can be performed in $O(1)$ time for an array-based representation, or $O(\log n)$ time for a linked-tree representation.
- In the worst case, up-heap and down-heap bubbling perform a number of swaps equal to the height of T .

Analysis of a Heap-Based Priority Queue

Operation	Running Time
<code>len(P), P.is_empty()</code>	$\Theta(1)$
<code>P.min()</code>	$\Theta(1)$
<code>P.add()</code>	$O(\log n)^*$
<code>P.remove_min()</code>	$O(\log n)^*$

*amortized, if array-based