

# Priority Queues

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## Priority Queue

A priority queue (PQ) is an ADT that arranges data elements according to per-element keys ("priorities"): In a minimizing (maximizing, resp.) PQ the element with smallest (largest, resp.) overall key is served first.

- Keys need to belong to a totally ordered set.
- Standard operations for minimizing PQs:
  - **FindMin**: return element with smallest key
  - **DeleteMin**: return and remove element with smallest key from PQ
  - **Insert**: insert a new element
  - **DecreaseKey**: decrease the key of an element
  - **Remove**: remove an element from PQ
  - **Merge**: merge (aka meld) two PQs

**Note:** Standard implementation of PQ: Binary heap

## Binomial Tree

A binomial tree is an ordered rooted binary tree is defined recursively as follows:

- A binomial tree of order 0 consists only of the root node
- For  $k \in \mathbb{N}_0$ , a binomial tree of order  $k + 1$  consists of two binomial trees of order  $k$  such that one binomial tree is the left-most subtree of the other.

### Lemma (112)

For  $k \in \mathbb{N}_0$ , a binomial tree of order  $k$  has  $k$  subtrees (from left to right) of orders  $k - 1, k - 2, \dots, 1, 0$

#### Proof:

Consider a binomial tree  $B_k$  of order  $k$ .

**IB:** Consider a binomial tree  $B_k$ . It's order is 1. Obviously, the tree comprises of 1 subtree of order 1.

**IH:** A binomial tree  $B_k$  consists of  $k$  subtrees of the orders  $k - 1, k - 2, \dots, 1, 0$ .

**IS:** We consider a binomial tree  $B_{k+1}$  of order  $k + 1$ . According to the definition of a binomial tree it comprises of two binomial trees  $B_k$ . Applying the induction hypothesis to  $B_k$  tells us that the binomial tree comprises of subtrees of  $B_{k-1}, B_{k-2}, \dots, 1, 0$ . Hence, we have  $B_k, B_{k-1}, B_{k-2}, \dots, 1$  in total.

### Lemma (113)

For  $k \in \mathbb{N}_0$ , a binomial tree of order  $k$  has  $2^k$  nodes and height  $k$ .

**Proof:**

**IB:** It's easy to see that a binomial tree  $B_0$  consists of 1 node. (Definition)

**IH:** A binomial tree of order  $k$  has  $2^k$  nodes and height  $k$ .

**IS:** Consider a binomial tree  $B_{k+1}$ . By definition a binomial tree comprises of two binomial trees  $B_k$ . Due to IH we know that both trees have  $2^k$  nodes. Since  $2^k + 2^k = 2^{k+1}$  we know that a binomial tree has  $B_{k+1}$  has  $2^{k+1}$  nodes in total.

**Lemma (114)**

For  $k \in \mathbb{N}_0$ , a binomial tree of order  $k$  has  $\binom{n}{d}$  nodes at depth  $d$ .

**Binomial Heap**

A binomial heap is a collection of binomial trees that satisfy the binomial heap property:

- Each binomial tree is a min heap, i.e., for all nodes  $v$  of the binomial tree, all keys of the children of  $v$  are greater than (or at most equal to) the key of  $v$ .
- For any  $k \in \mathbb{N}_0$ , there is at most one binomial tree of order  $k$ .
- The binomial trees are arranged in a right-to-left sorted sequence according to their orders, with the tree of smallest order being right-most.

**Lemma (116)**

For  $n \in \mathbb{N}_0$  a binomial heap with a total of  $n$  nodes contains a binomial tree of order  $k$  if and only if the bit that corresponds to  $2^k$  in the binary representation of  $n$  is 1.

**Proof:**

Every natural number can be uniquely represented as binary number. From lemma 113 we know that a binomial tree of order  $k$  has  $2^k$  nodes. We can construct a binomial heap that comprises of different unique binomial trees  $B_k$  where the  $k$ -th bit is set to 1. Hence, the sum of all nodes in the binomial heap becomes:

$$n = \sum_{i=0; i\text{-th bit is 1}}^K 2^i$$

**Merging Binomial Heaps**

- We visit the binomial trees of both binomial heaps according to increasing order  $k$ , starting with  $k := 0$ .
  - If both heaps and the carry contain exactly...
    - no binomial tree of order  $k$ : Do nothing
    - one binomial tree  $B_1$  of order  $k$ : Move  $B_1$  to the result
    - two binomial trees  $B_1, B_2$  of order  $k$ : Merge  $B_1$  and  $B_2$  into a tree  $B$  of order  $k + 1$  and move  $B$  to the carry.

- three binomial trees  $B_1, B_2, B_3$  of order  $k$ : Merge  $B_1$  and  $B_2$  into a tree  $B$  of order  $k + 1$  and move  $B$  to the carry. Move  $B_3$  to the result.
- Increment  $k$  after processing the binomial trees of order  $k$ .

### Lemma (117)

Merging two binomial heaps with a total of  $n$  nodes takes  $O(\log(n))$  time.

**Proof:**

The representation of any decimal number requires at most  $\lfloor \log(n) \rfloor + 1$  bits. Hence, lemma 116 tells us that we need at most  $\lfloor \log(n) \rfloor + 1$  binomial trees. Hence, we need to perform  $O(\log(n))$  trivial merges of two binomial trees of the same order. Each such merge takes  $O(1)$  time.

### Lemma (118)

A new element can be inserted into a binomial heap with a total of  $n$  nodes in  $O(\log(n))$  worst-case and  $O(1)$  amortized time.

**Proof:**

- **Worst-case:** A new heap that contains only the new element and merge it with the old heap. Hence the worst-case complexity is  $O(\log(n))$ .
- **Average Case: Aggregate method:** When does the  $i$ -th tree need to be changed?
  - The 1st tree gets added / removed every time
  - The 2nd tree gets added / removed every second time
  - The 3rd tree gets added / removed every fourth time

Hence, for a sequence of  $n$  inserts we get:

$$\sum_{i=1}^n \lfloor \frac{n}{2^{i-1}} \rfloor \leq \sum_{i=0}^n n \sum_{i=1}^{n-1} \frac{1}{2^i} = 2n$$

Therefore, the inserts can be done in amortized  $O(1)$ .

### Lemma (119)

Finding the minimum element in a binomial heap with a total of  $n$  nodes takes  $O(\log(n))$  time.

**Proof:** It suffices to inspect the roots of all binomial trees. There are  $\lfloor \log(n) \rfloor + 1$  trees. Obviously, by keeping a pointer to the root with minimum key, this time can be reduced to  $O(1)$ .

### Lemma (120)

The minimum element can be deleted from a binomial heap with a total of  $n$  nodes in  $O(\log(n))$  time.

**Proof:** The minimum can be found in  $O(\log(n))$  time. By removing the root / binomial tree we split one binomial tree into a sequence of subtrees which in turn are binomial heap. Now, we merge this new binomial heap with the rest of the original binomial heap. This can be done in  $O(\log(n))$  time.

### Lemma (121)

The key of a known element of a binomial heap with a total of  $n$  nodes can be decreased in  $O(\log(n))$  time.

**Proof:**

After decreasing the key we may need to (repeatedly) exchange the corresponding node with its parent node if the min-heap property is violated. We need to put a bound on the height of the binomial tree.

The largest binomial tree as order  $\log(n)$ . A binomial tree of order  $\log(n)$  has size  $\log(n)$ . Therefore, it can take  $O(\log(n))$  time.

### Lemma (122)

An element can be deleted from a binomial heap with a total of  $n$  nodes in  $O(\log(n))$  time.

**Proof:**

We first decrease the key of the element to a value smaller than the minimum key. ( $O(\log(n))$ ) This causes the element to be the root of a tree. Deleting the element can therefore be done in  $O(\log(n))$  time.

## Fibonacci Heaps

- The name is derived from the fact that the Fibonacci numbers show up in the complexity analysis of its operations.
- Similar to binomial heaps, but less rigid. Fibonacci heaps **lazily** defer all clean-up work after an Insert til the next DeleteMin

For example, merge operation simply links two heaps, insert operation simply adds a new tree with single node. The operation extract minimum is the most complicated operation. It does delayed work of consolidating trees.

### Fibonacci Heap

- Collection of min heaps (no binomial heap)
- Maintains pointer to element with minimum key
- Some nodes are "marked".

### Representation

**Heap representation:**

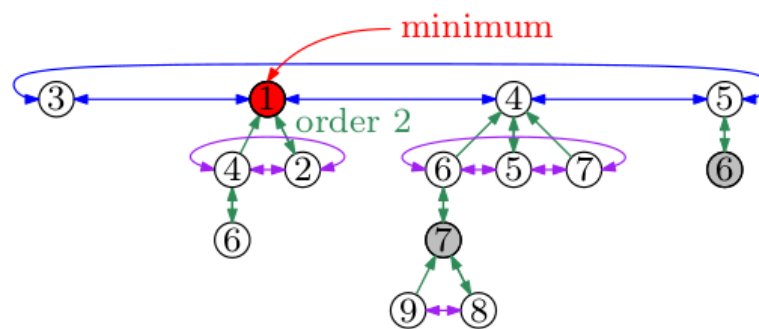
- Maintain root nodes in doubly-linked circular list
- Store pointer to root node with minimum key

**Node representation:**

- A pointer to its parent
- A pointer to one of its children
- The number of its children
- Pointers to its left and right siblings
- A binary flag that indicates whether the node is marked

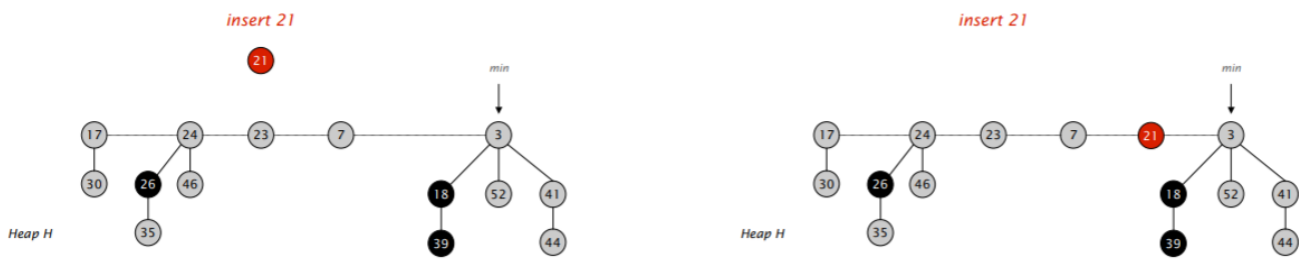
### Marking of nodes:

- **Unmarked:** The node has had no child cut
- **Marked:** The node has had once child cut
- Basic idea: When a child is cut from a marked parent node, then the parent node (together with its entire subtree) is cut, too, and moved to the root list.
- The marking of nodes ensures that Fibonacci heaps keep roughly the structure of binomial heaps after the deletion of nodes, thus ensuring amortized bounds
- The root node is always unmarked



### Insert operation

- Create a new node and insert into the list of root nodes
- Update pointer to (new) minimum root node if required



### Link operation

- If  $r_1.key \geq r_2.key$  then make  $r_1$  a child of  $r_2$ , otherwise  $r_2$  becomes a child of  $r_1$ .
- Update information on the order of  $r_2$  (or  $r_1$ )

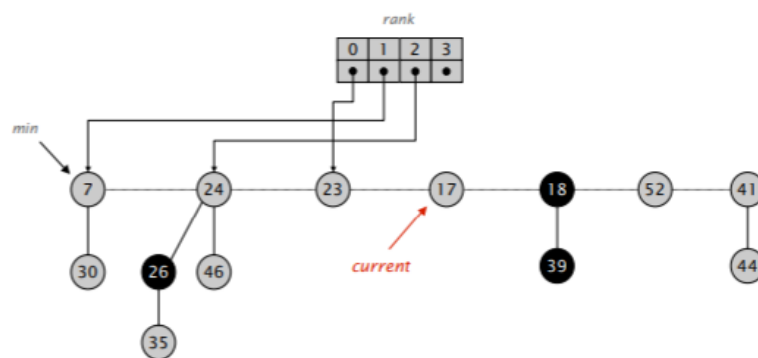
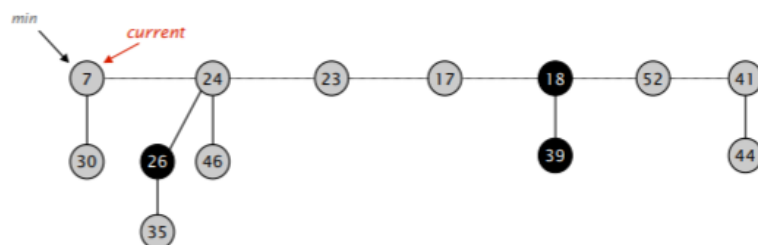
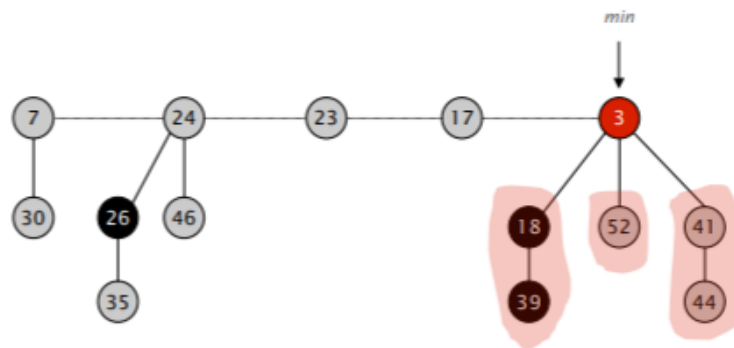
### Cut operation

- Remove  $v$  from the child list of its parent  $p$  and insert it into the root list
- Update information on the order of  $p$
- Mark  $p$

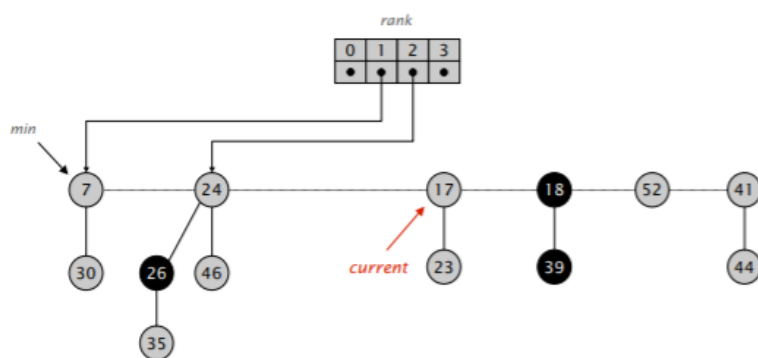
### DeleteMin

- Delete the root node with the current minimum

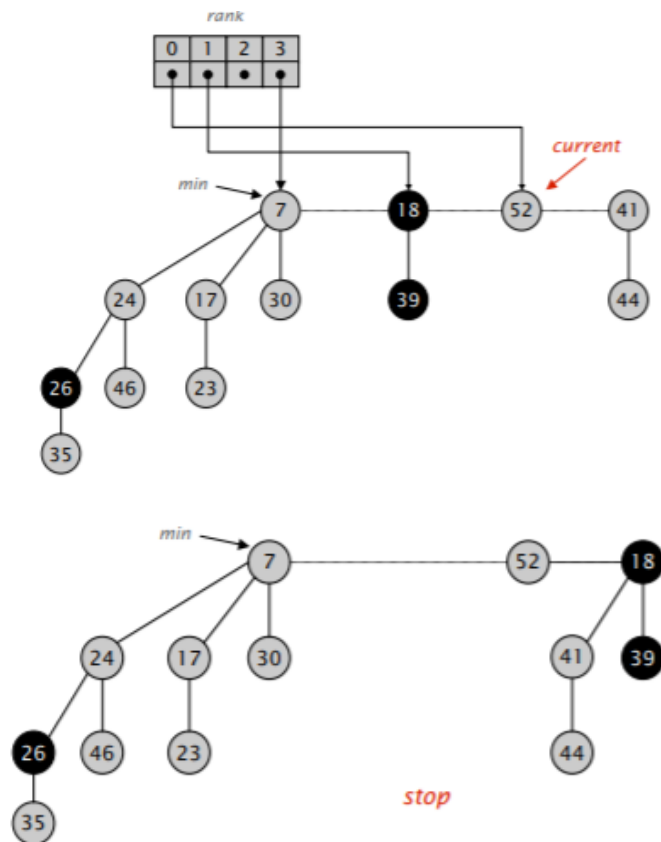
- Move its children as new root nodes into the list of root nodes
- Link trees until no pair of nodes has the same order
- Update pointer to minimum root



link 23 into 17



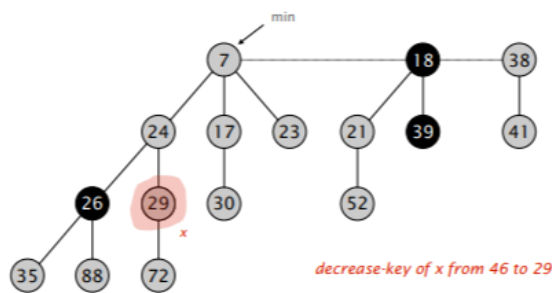
link 17 into 7

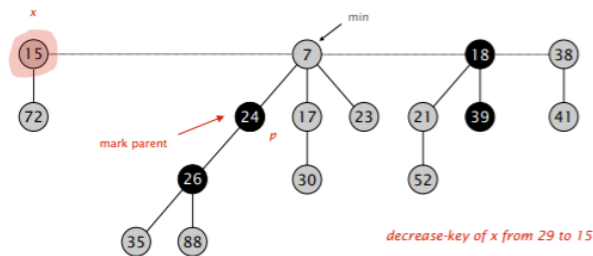
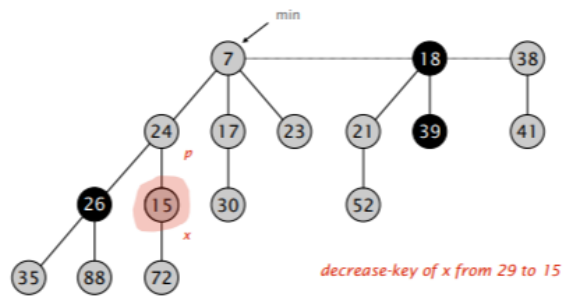


## DecreaseKey

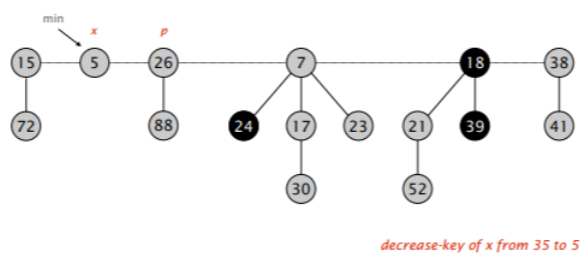
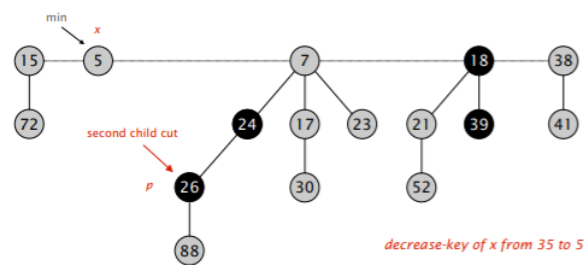
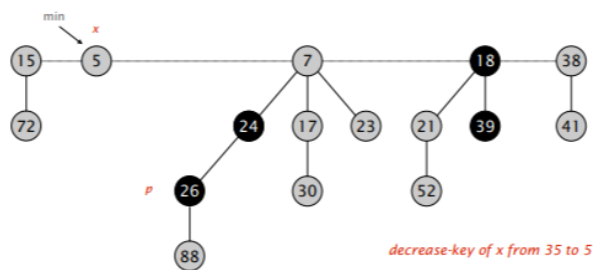
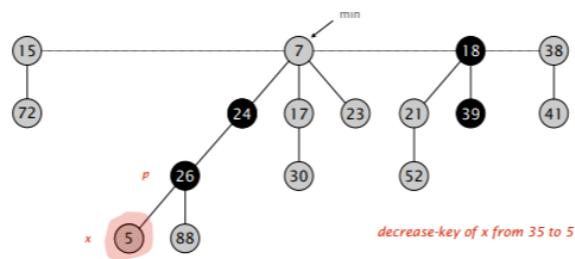
- If the new key of  $v$  is less than the key of the parent  $p$  then cut  $v$  and move it (with its subtree) to the root list.
- If  $p$  is not marked then mark  $p$
- Else, cut  $p$  and move to root list and apply recursively to its parents
- Update pointer to minimum root

### Case 1:

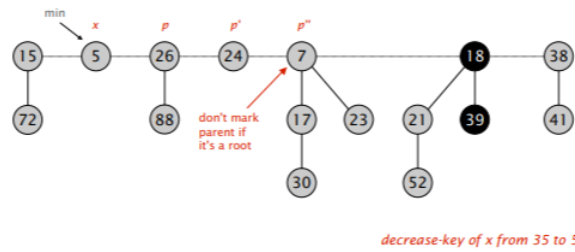




Case 2:







### Lemma (123)

If only Insert and DeleteMin operations are carried out, then a Fibonacci heap is a binomial heap after every DeleteMin operation.

**Note:** If no consolidation occurs (since no suitable DeleteMin operation is carried out) then a Fibonacci heap with  $n$  nodes may degenerate to one single tree, or even to an unsorted linked list (of  $n$  root nodes) or an "unary" tree of height  $n - 1$ .

#### Proof:

By induction: Every DeleteMin results in a consolidation phase during which pairs of trees which have root nodes of the same order are linked.

### Lemma (124)

If a node of a tree in a Fibonacci heap has  $k$  children then it is the root of a subtree with at least  $F_{k+2}$  nodes.

### Corollary (125)

Every node of a tree in a Fibonacci heap with a total of  $n$  nodes has at most  $O(\log(n))$  children.

#### Proof:

Let  $k$  be the number of children of a node  $v$ . By lemma 124, its subtree has  $F_{k+2}$  nodes. Hence,

$$n \geq F_{k+2} \geq (\text{Lemma 5}) \phi^k \text{ implying } k \leq \log_{\phi} n$$

### Theorem (126)

When starting from an initially empty heap, any sequence of  $a$  Insert,  $b$  DeleteMin and  $c$  DecreaseKey operations takes  $O(a + b \cdot \log(n) + c)$  worst-case time, where  $n$  is the maximum heap size.

- Hence, from a theoretical point of view, a Fibonacci heap is better than a binomial heap when  $c$  is smaller than  $b$  by a non-constant factor.
- A Fibonacci heap is also better than a binomial heap when frequent merging of heaps is required.
- However, the worst-case time for one DeleteMin or DecreaseKey operation is linear, which makes Fibonacci heaps less suitable for applications which cannot tolerate excessive running time for individual operation.
- Fibonacci heaps are sometimes reported to be slow in practice due to hidden constants.

## Performance Summary

**Performance Summary for Priority Queues with  $n$  Elements**

Operation	Linked List	Binary Heap	Binomial Heap	Fibonacci Heap
Insert	$O(1)$	$O(\log n)$	$O(1)^*$	$O(1)$
FindMin	$O(n)$	$O(1)$	$O(\log n)$	$O(1)$
DeleteMin	$O(n)$	$O(\log n)$	$O(\log n)$	$O(\log n)^{**}$
DecreaseKey	$O(1)$	$O(\log n)$	$O(\log n)$	$O(1)^{**}$
Merge	$O(1)$	$O(n)$	$O(\log n)$	$O(1)$

\*: amortized complexity; worst-case complexity is  $O(\log n)$ .

\*\* : amortized complexity; worst-case complexity is  $O(n)$ .