

# Advanced Data Structures: Priority Queues

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# Project

This project is about priority queues based on the Binary Heap and Fibonacci Heap respectively. The main difference is that the Fibonacci Heap have a amortized  $O(1)$  *decrease key* operation, where the Binary Heap have  $O(\log n)$ .

We will implement both heaps, and use them to implement Dijkstras Algorithm for Single Source Shortest Path. Then we will describe a class of graphs with many *decrease key* operations to hopefully show that Fibonacci Heap is faster, despite the much larger constants hidden in the big-O notation.

## Binary Heap

We use an array of pointers for our implementation, similar to maximum priority queue in Cormen [1]. Specifically family relations are easily expressed in the following way (assuming the array index start at 1): Given a node of index  $i$ : parent index  $\lfloor i/2 \rfloor$ , left child index  $i * 2$  and right child  $i * 2 + 1$ . The important property of the heap is that given any node,  $i$ , we know that all nodes in the entire tree, with  $i$  as root, have key at most that of  $i$ . Our binary heap implementation support the following operations:

- *initialize* is a simple matter of allocating memory and setting the current size to 0. This is  $O(1)$  if we assume that allocating the memory is a constant time operation.
- *insert* the new element into the first available position, and then bubbled up by exchanging the element and its parent as long as the heap property is violated. Potentially the entire way upto the root, if it's the new minimum. This takes  $O(\log n)$  if we need to move it the all way to the root of the tree.
- *decrease key* takes a pointer to an element, and decrease the key. Then, as in insert, it will bubble up the element until the heap property is restored. This also takes  $O(\log n)$  for the same reasons.
- *find min* is a simple operation due to the heap property, it will always be the root element of the tree, i.e. the first element in our array. This takes  $O(1)$ .
- *delete element* takes a pointer to an element to delete. It will move the last item to the index of the deleted element, and thus the heap property might be violated. Then a call to the helper function *min heapify* is made to restore the heap property. Therefore the time complexity is determined by *min heapify* - and as we will see, this is  $O(\log n)$ .
- *min heapify* takes a pointer to the element that might violate the heap property. It works by comparing the the element to its parent first and
  - if the parent is the same size we're done.
  - if the parent is larger we need to bubble the element up.
  - if the parent is smaller we may need to move the element down.

In the cases where we have to move the item, we recursively call the procedure again on the new position until we terminate. The work that has to be done, is at most moving the element all the way from the root to a leaf, or from a leaf to the root. This gives a time complexity of  $O(\log n)$ .

## Fibonacci Heap

The Fibonacci heap entirely consists of pointers and only utilizes an array when the scanning of ranks is to be executed. Each node contains four pointers. Two pointing to its left and right siblings, one pointing at its parent and one to a child. Having a pointer to the left and the right results in the nodes forming a doubly linked list at each level. The heap does not order the lists in any way, since a particular order depending on the rank or the key of the nodes does not have any impact on the correctness or efficiency of heap operations. This doubly linked list allows us to extract and insert nodes in very little (constant) time. Some invariants however need to be maintained:

- *initialize* Extracting/deleting child nodes result in the parent being marked. If it is already marked, the parent itself has to be extracted and placed at in the root list. This cascades to the parent of that, marking it or recursing further if it is marked as well.
- *initialize* When deleting the minimum, the heap has to clean up the root list. After this operation there exist no two root nodes with the same rank.

Some of the more curious parts of the implementation also involve the `delete_min` operation. Since `delete_min` is iterating a doubly linked list, which is modified while looping, the pointer to the next node is saved before any other operations begin. The loop could otherwise continue in the child list of a node already registered in the scanning array, after the current node has been made a child of it, because it had the same rank.

A custom invariant in the fibonacci heap, set and maintained by us, is the fact that there not ever exists an invalid linked list. Once node is extracted from a list, it is immediately linked to itself on the left and the right. This way later union operations will always be able to link the node into a new list without any dangling pointers.

## Primitive Priority Queue

To test for correctness and to have some “stupid” reference, we implemented a very primitive queue. This queue is a linked list, and initializing, inserting, deleting and decrease key are all constant operations. The find min operation scan the entire list and return the minimum element, a  $O(n)$  operation.

# Testing of implementations

## Test Setup

We test by generating the graph in memory, and then run Dijkstras algorithm as described in Fredman and Tarjan [2]. We measure the time it take for Dijkstras Algorithm to finish with each of the three different priority queues. We test a suitable number ot times compared to the input (the smaller input the more trials), and take the average. The test machine was a 2x quad-core Intel Xeon 2.8 GHz with 8 GiB 800MHz DDR2 ram. The program was build using gcc version 4.2.1 (Based on Apple Inc. build 5658) (LLVM build 2335.15.00).

The program can be build by entering the folder **p1\_heap** and run the following command: `make -f p1_heap.mk all`. This requires MAKE and GCC to be installed. Then the compiled binary will be in the subfolder **Debug**, and can be run with `./p1_heap`.

## Test Data

### Graphs with many *decrease key* operations

Constructing a graph with many *decrease key* operations is fairly easy. The problem is making sure the *decrease key* operation force the Binary Heap to move the element. If the element after the *decrease key* doesn't violate the Binary Heap property, it does not need to be moved and will be a constant operation, and thus it will match the Fibonacci Heap.

The graph is generated with the following code:

This graph will call *decrease key* on all edges that is outgoing from the node return by *delete min*, and the node will have an edge to all remaining nodes in the graph. Further more, all *decrease key* calls will force the Binary Heap to bubble the element from a leaf to the root for every call, and thus maximizing the work done.

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**Algorithm 1** Generate graph max decrease calls

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**Require:** number of vertices  $n$

```
1: for  $j := 1; j < n; j := j + 1$  do
2:    $weights[0][j] := n * n - j$ 
3: end for
4:  $weights[0][n] := 1$ 
5: for  $i := n - 1; i > 1; i := i - 1$  do
6:   for  $j := 1; j < i; j := j + 1$  do
7:      $weights[i][j] := n^2 - (n - i)n - j + 1$ 
8:   end for
9:    $weights[i][i - 1] := 1;$ 
10: end for
11: return  $weights$ 
```

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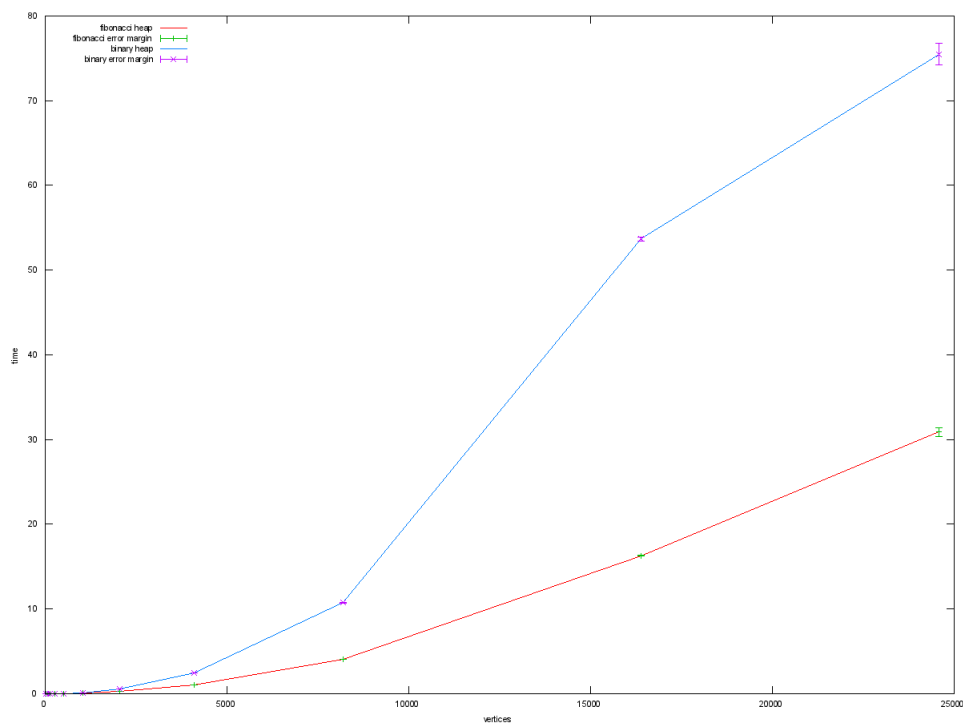
## Random Graphs

The random graphs are created by random chance. For every node it has a chance of getting an edge to another node, and the weight is random as well. Furthermore it's possible to set the seed, such that you can always generate the same random graph.



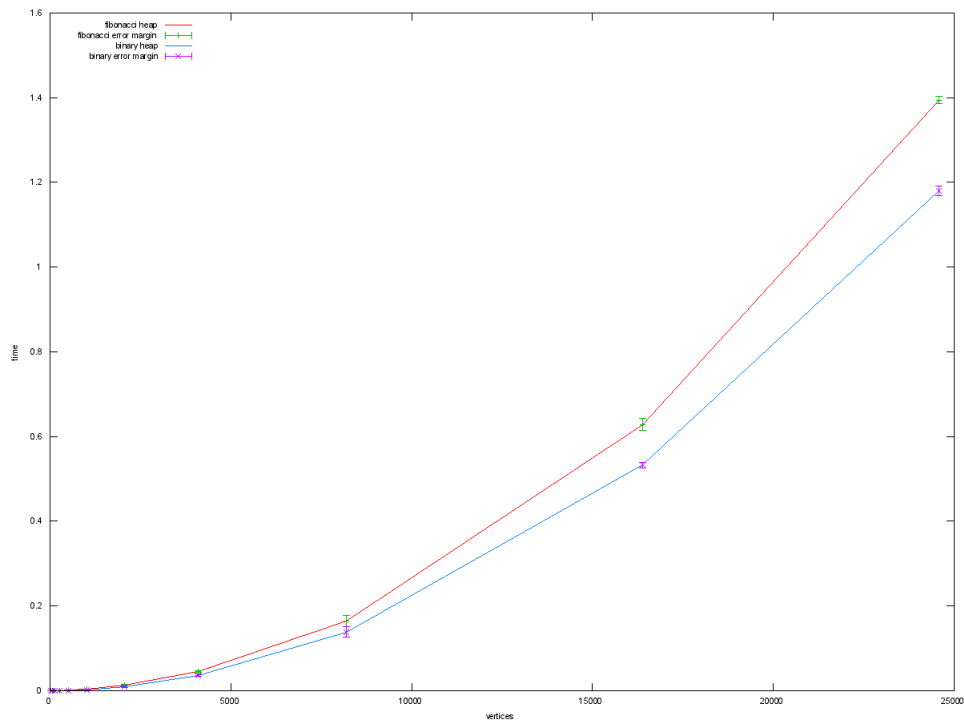
# Results

## Maximizing decrease key calls



It's rather obvious that Binary Heap performs significantly worse than Fibonacci Heap, just as expected. Binary Heap curve have a odd shape, but we tripple checked the results, so our main guess is that some underlying VM or hardware played a role.

## Random Graphs



Here we see that the difference between Binary and Fibonacci heaps are almost insignificant, but with Binary Heap leading. The graphs was created with chance of edge 15% and max weight 20.

## Conclusion

It's fairly obvious that unless given a graph, that is constructed in such a way that maximize *decrease key* calls and the work the Binary Heap have to do, then then Binary Heap is to be preferred due to the much smaller constants.

# Bibliography

- [1] Thomas H. Cormen et. al., *Introduction to algorithms*, 2nd Edition.
- [2] M. L. Fredman and R. E. Tarjan *Fibonacci Heaps and Their Use in Improved Network Optimization Algorithms*