## **Binary Heaps: Homework**

• Implement the array-based representation of binary heap together with the functions HEAP\_MIN, REMOVE\_MIN, HEAPIFY, BUILD\_HEAP, DECREASE\_KEY, and INSERT\_VALUE.

The solution can be found in the file binheap.c in the folder Binary heaps, with the corresponding names min\_value, extract\_min, heapify, build\_heap, decrease\_key and insert\_value. The functions is\_heap\_empty, swap\_keys, find\_the\_max, delete\_heap, and print\_heap are also added.

• Implement an iterative version of HEAPIFY.

The solution can be found in the function heapify, contained in the file binheap.c in the folder Binary heaps.

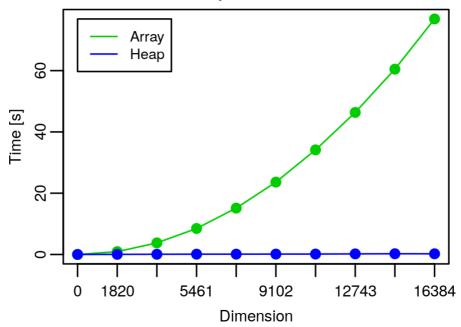
• Test the implementation on a set of instances of the problem and evaluate the execution time.

After running test\_delet\_min the following output was generated:

```
1 $ ./test_delete_min
 2
3 n
         On Heaps
                      0n Arrays
0.000005
          0.000014
 4 0
5 1820 0.039135
                       0.931853
                      3.782944
8.491803
15.135461
23.618608
34.143487
6 3640 0.070701
7 5461 0.098816
8 7281 0.105832
9 9102 0.124539
10 10922 0.139834
                      46.353465
60.489976
11 12743 0.193662
12 14563 0.239347
13 16384 0.219621 76.866161
```

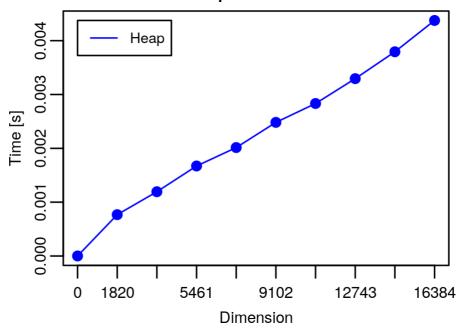
In the following graph we can see the execution time of the program test\_delet\_min:

## Computational time



We can see that  $\ref{eq:continuous}$  for the heps the time of extraction is O(log n): replacing the root's key costs  $\Theta(1)$  and the total cost of <code>HEAPIFY</code> is the height of the heap: O(log n), so deleting the minimum with the heaps costs O(log n).





• (Ex. 6.1-7 in [1]) Show that, with the array representation, the leaves of a binary heap containing n nodes are indexed by  $\lfloor n/2 \rfloor + 1, \lfloor n/2 \rfloor + 2, \ldots, n$ .

Let us consider a binary heap containing n nodes. Since the children of a node i are the nodes 2i (the left child) and 2i+1 (the right child), we have that the "last" parent, meaning the right-most parent in the second-last level, can at most be the node  $\lfloor n/2 \rfloor$ . That is because if we suppose that  $\lfloor n/2 \rfloor + 1$  is a parent node, then its children are the nodes  $2(\lfloor n/2 \rfloor + 1)$  and  $2(\lfloor n/2 \rfloor + 1) + 1$ , but the left child would be

$$2\cdot (\lfloor n/2\rfloor +1) = 2\cdot \lfloor n/2\rfloor +2 = \left\{ \begin{matrix} 2\cdot n/2 +2 & n \text{ even} \\ 2\cdot (n-1)/2 +2 & n \text{ odd} \end{matrix} \right. = \left\{ \begin{matrix} n+2 & n \text{ even} \\ n+1 & n \text{ odd} \end{matrix} \right.$$

that is out of the boundary of the array, that is impossible. So all the nodes after the node  $\lfloor n/2 \rfloor$  must be leaves. Then we have the proof that the nodes  $\lfloor n/2 \rfloor + 1, \lfloor n/2 \rfloor + 2, \ldots, n$  are leaves.

• (Ex. 6.2-6 in [1]) Show that the worst-case running time of HEAPIFY on a binary heap of size n is  $\Omega(\log n)$ .

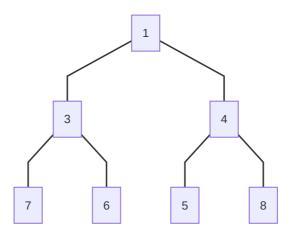
(**Hint**: For a heap with n nodes, give node values that cause HEAPIFY to be called recursively at every node on a simple path from the root down to a leaf.)

Let us consider a binary heap of size n. Since a simple path from the root down to a leaf is the height of the tree h, we have to estimate h in terms of n. In a binary tree the root has 2 children at depth 1, each of which has 2 children at depth 2, etc. Thus, the number of nodes ( $\equiv$  leaves) at depth h is  $2^h$ . Consequently, the height of a complete binary tree with m leaves, which is the length of the simple path from the root to a leaf, is  $\log_2 m$ . Since the number of leaves in a complete binary tree is (n+1)/2 (n is always odd in a complete binary tree and the number of leaves is  $\lceil n/2 \rceil$ , as seen in the following exercise), we have that the height is  $\log_n(n+1)/2 = \log_2(n+1) - \log_2 2 = \log_2(n+1) - 1$ . So in the worst case, if HEAPIFY is called for all the height of the tree, it is called  $\Omega(\log n)$  times.

For example, with the following array in a Min\_heap, when the minimum is deleted HEAPIFY is called recursively at every node on a simple path from the root down to a leaf:



that corresponds to the tree



• (Ex. 6.3-3 in [1]) Show that there are at most  $\lceil n/2^{h+1} \rceil$  nodes of height h in any n-element binary heap.

The height of a node in a tree is the number of edges on the longest simple downward path from the node to a leaf, and the height of a tree is the height of its root. The height of a tree is also equal to the largest depth of any node in the tree.

Let us consider a n-element binary heap with height h. We have that the height of the root is h and the height of the children of the root is h-1, while the height of a leaf is 0 and the height of the parents of the leaves is 1.

Since all the nodes after  $\lfloor n/2 \rfloor$  are leaves, we have  $\lceil n/2 \rceil$  leaves, so we have  $\lceil n/2^{0+1} \rceil$  nodes at height 0. We have a binary heap, so we have a binary tree, thus the number of parents of the leaves will be half the number of the leaves, so we will have  $\lceil (n/2)/2 \rceil = \lceil n/4 \rceil = \lceil n/2^{1+1} \rceil$  nodes at height 1. Let's assume that we have  $\lceil n/2^{(i-1)+1} \rceil = \lceil n/2^i \rceil$  nodes at height i-1, their parents will be half of them, so they will be  $\lceil (n/2^i)/2 \rceil = \lceil n/2^{i+1} \rceil$ , so we have  $\lceil n/2^{i+1} \rceil$  nodes at height i. So by induction we have

 $\lceil n/2^{h+1} \rceil$  nodes at height h, and we have proved our thesis. Besides, the root is at height  $h = \log_2 n$ , so we have  $\lceil n/2^{\log_2 n+1} \rceil = \lceil n/2n \rceil = \lceil 0, \ldots \rceil = 1$  node at height h.

## References

[1] T.H. Cormen, C.E. Leiserson, R.L. Rivest, and C. Stein. *Introduction to Algorithms*. The MIT Press. MIT Press, 2009.