## Solutions for Homework Assignment #1

## Answer to Question 1.

**Answer:** T(n) is  $\Theta(n)$ . To prove this, we now show that T(n) is both O(n) and  $\Omega(n)$ :

- 1. T(n) is O(n).
  - Consider the first iteration of the outer loop (lines 3-6), when i=1. In this iteration, when j reaches the value n-1 in the inner loop (lines 4-6), the condition i+j>n-1 in line 6 is met, and the procedure terminates.
  - So, for all possible input arrays A: (a) there is only one iteration of the outer loop, and (b) the inner loop is executed at most n-1 times.

Since each iteration of the inner loop takes **constant** time (because each one consists of a constant number of comparisons and additions), it is now clear that there is a constant c > 0 such that for all  $n \ge 2$ : for **every** input A of size n, executing the procedure NOTHING(A) takes **at most**  $c \cdot n$  time.

2. T(n) is  $\Omega(n)$ .

This is not obvious because the procedure may return "early" (e.g., after executing only a constant number of inner loop iterations) because of the loop exit conditions in line 5 and 6. Thus, to show that T(n) is  $\Omega(n)$ , we must show that there is at least one input array A such that the procedure executes a linear number of inner loop iterations on this input, **despite the loop exit conditions** of lines 5 and 6. We do so below.

Consider the array  $A = [-1, 2, -1, 2, -1, \ldots]$  of alternating -1 and 2 of size  $n \ge 2$ . Note that:

- (a) For all  $j \geq 1$ , A[j] = 1 A[j+1]. So with **this** input array A, the return condition  $A[j] \neq 1 A[j+1]$  in line 5 of the code is **never** true. Thus, with **this** input, the procedure **never** returns in line 5.
- (b) When i = 1 (in the first iteration of the outer loop of lines 3 6), the condition i + j > n 1 in line 6 holds only after at least n 2 complete iterations of the inner loop.

So, for *some* input array A, namely  $A = [-1, 2, -1, 2, -1, \ldots]$ , the inner loop is executed at least n-2 times.

Since each iteration of the inner loop takes constant time, it is now clear that there is a constant c > 0 such that for all  $n \ge 2$ : there is **some** input A of size n such that executing the procedure NOTHING(A) takes **at least**  $c \cdot n$  time.

**Important note:** For many arrays A of size n, for example all those where  $A[2] \neq 2$ , those where A[2] = 2 but  $A[3] \neq -1$ , etc..., the execution of procedure NOTHING(A) takes only constant time! This is because the execution stops "early", in line 5, on these arrays.

So to prove that the worst-case time complexity of NOTHING() is  $\Omega(n)$ , a correct argument **must** explicitly describe some specific input array A of size n for which the execution of NOTHING(A) does take time proportional to n.

## Answer to Question 2. (Solution Sketch)

- 1. The algorithm uses a binary Max Heap to store the m smallest keys input so far. It works as follows:

  Insert each of the first m input keys into the Max Heap (using the binary heap INSERT operation).

  Then:
  - When a key input occurs: first insert this key into the Max Heap (using the Insert operation), and then remove the maximum key of the Max Heap (using the ExtractMax operation). A simple induction argument shows that, after m or more input keys occur, the Max Heap contains the m smallest keys that were input so far.
  - When a print occurs: print all the m keys that are currently in the Max Heap.
- 2. It is clear that, at all times, the Max Heap has at most m+1 elements. So each INSERT and EXTRACTMAX operation takes  $O(\log m)$  time in the worst-case. Therefore:
  - Processing each input key takes  $O(\log m)$  time in the worst-case.
  - Each print operation takes O(m) time, because it consists of printing the m keys in the array that represents the Max Heap.