

## Recitation 9: Analysis of Algorithms

(1) Consider the following (inefficient, but correct) implementation of a function to find the minimum element of a LinkedList of integers:

```
public static int findMinimum(LinkedList<Integer> l) {
    int tempMin = l.get(0);
    for (int i = 1; i < l.size(); i++){
        int current = l.get(i);
        if (current < tempMin) tempMin = current;
    }
    return tempMin;
}
```

Note: The get method above traverses the nodes of the LinkedList, starting at index 0, until it finds the element at index  $i$ , then returns the element.

(a) Give the runtime complexity (asymptotic complexity) of running this function on a list with  $n$  elements.

Running time is  $O(n^2)$ . There are order  $n$  iterations through the loop and in each iteration, operation `l.get(i)` takes time  $O(n)$ .

(b) Rewrite the function to run in  $O(n)$  time.

```
Integer tempMin = Integer.MAX_VALUE
for(Integer i : l){
    if(i < tempMin) tempMin = i;
}
return tempMin.intValue();
```

(2) Give the runtime complexity of the following operations on data structures, and a brief explanation:

1. Inserting a new element into an ArrayList at an arbitrary index.

Takes time  $O(n)$  since you need to copy the full array.

2. Inserting a new element as the first element of the LinkedList.

Takes time  $O(1)$  since you just need to change the the pointers

3. Removal of an arbitrary element of an ArrayList.

Takes time  $O(n)$  since you need to copy all the subsequent elements to their new location

4. Accessing an arbitrary index of an ArrayList.

Takes time  $O(1)$  since arrays have constant time lookup

5. Counting the number of nodes in a Tree.

Takes time  $O(n)$  to traverse the tree since you have to visit all the nodes

6. Computing the depth of a balanced tree.

Takes time  $O(\log n)$ , since a balanced tree with branching factor  $b$  has depth  $\log_b n$

7. Searching for an element in a tree.

Takes time  $O(n)$  since you have to check all the elements of the tree.

8. Searching for an element in a binary search tree.

Takes time  $O(d)$  in a tree of depth  $d$  since you only have to check one branch. ( $O(\log n)$  in a balanced binary tree.)

9. Reversing the order of words in a string. (Java is fun becomes fun is Java)

Depends on the implementation. A naïve implementation takes time  $O(n^2)$  since there can be  $O(n)$  word and each time you rewrite the string (move one word) takes time  $O(n)$

10. [Extra credit] Calculating whether a number is prime or not.

Depends on the algorithm. The best known deterministic algorithm takes time  $O(\log^{6+\epsilon} p)$ .

11. [Hard] Computing the median of numbers in a linked list.

The best worst-case running time is  $O(n \log n)$ , which can be achieved by sorting the list using merge sort and then walking down the list to the middle element. Average-case time  $O(n)$  can be achieved with a version of QuickSort that only recurses on one side, but it has worst-case time  $O(n^2)$ .

(3) Write down the asymptotic complexity of each of the following functions:

1.  $f(n) = \sqrt{n^3 + n^2 + 10}$        $O(n^{3/2})$

2.  $f(n) = n!$        $O(n^n)$

3.  $f(n) = 2^n + n^2$        $O(2^n)$

4.  $f(n) = n \log n + (\log n)^2$        $O(n \log n)$

5.  $f(n) = 100000n + \log n$        $O(n)$

6.  $f(n) = n + 0.0000000012^n$        $O(2^n)$

7.  $f(n) = \sum_{k=1}^K \log n^k$        $O(K^2 \log n)$

8.  $f(n) = \log \log n$   $O(\log \log n)$

9.  $f(n) = (n + 10)^4$   $O(n^4)$

10.  $f(n) = \sqrt{n} + 10 \log n$   $O(\sqrt{n})$

(4) Give the asymptotic complexity of the following recursive function from lecture notes:

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```
/** = a**n. Precondition: n >= 0 */
static int power(int a, int n) {
    if (n == 0) return 1;
    if (n%2 == 0) return power(a*a, n/2);
    return a * power(a, n-1);
}
```

---

Each iteration takes constant time, and there are at most a logarithmic number of iterations (since at least half of the operations divide  $n$  by 2) so this function takes time  $O(\log n)$ .