

## Question 1

## CS 361, Lecture 15

Jared Saia  
University of New Mexico

Collection of true/false questions and short answer on:

- sorting algorithms (mergesort, heapsort, bubblesort)
- heaps (heights, number of nodes, heap algorithms, where is the max?, where is the min?)
- theta notation (i give you a bunch of functions and ask you to give me the simplest possible theta notation for each)

3

## Outline

## Question 2

- Midterm
- Quicksort

- A question on annihilators and recurrence trees (like problems 1-3 of hw)
- You'll need to know the formula for sum of an infinite convergent series

1

4

## Midterm

## Question 3

- 5 questions, 20 points each
- Hard but fair
- There will be some time pressure, so make sure you can e.g. solve recurrences both quickly and correctly.
- I expect a class mean of between 50 :( and 65 :) points

- A question on using annihilators to solve a recurrence with both homogeneous and non-homogeneous parts

2

5

## Question 4

- A question on writing recurrences for both the result of a function and the time cost of the function, and solving both of these recurrences using annihilators

6

## Question 5

- A question asking you to prove the correctness of an algorithm using loop invariants
- I'll give you the loop invariant and ask you to prove initialization, maintenance and termination
- Will be for an algorithm on heaps

7

## Questions

- Any questions?

8

## Review Session

There will be a review session Today at 1pm

Other Review Session Options:

- Today at 5pm
- Today at 7pm
- Tomorrow at 3pm
- Tomorrow at 5pm

9

## In-Class Exercise

- Imagine you have a min-heap with the following operations defined and taking  $O(\log n)$ :
  - (key,data) Heap-Extract-Min (A)
  - Heap-Insert (A,key,data)
- Now assume you're given  $k$  sorted lists, each of length  $n/k$
- Use this min-heap to give a  $O(n \log k)$  algorithm for merging these  $k$  lists into one sorted list of size  $n$ .

10

## In-Class Exercise

- Q1: What is the high level idea for solving this problem?
- Q2: What is the pseudocode for solving the problem?
- Q3: What is the runtime analysis?
- Q4: What would be an appropriate loop invariant for proving correctness of the algorithm?

11

## In-Class Exercise

```
KMerge (int arrList[][], int n, int k){
int arrI[] = new int[k];
int arrRes[] = new int[n];
for (i=1;i<= k;i++){
    Heap-Insert (A,arrList[i][1],i);
    arrI[i] = 1;
}
for (i=1;i<=n;i++){
    (key,listNum) = Heap-Extract-Min (A);

    arrRes[i] = key;
    arrI[listNum]++;
    if (arrI[listNum] <= n/k){
        Heap-Insert (A,arrList[listNum][arrI[listNum]],
                    arrI[listNum]);
    }
}
```

12

## Takeaway

- Can use heaps to merge  $k$  lists in  $O(n \log k)$  time
- Heaps are a simple but very handy data structure for solving lots of problems

13

## Quicksort

- Based on divide and conquer strategy
- Worst case is  $\Theta(n^2)$
- Expected running time is  $\Theta(n \log n)$
- An In-place sorting algorithm
- Almost always the fastest sorting algorithm

14

## Quicksort

*"To conquer the enemy without resorting to war is the most desirable. The highest form of generalship is to conquer the enemy by strategy" - Sun Tzu, The Art of War*

- **Divide:** Pick some element  $A[q]$  of the array  $A$  and partition  $A$  into two arrays  $A_1$  and  $A_2$  such that every element in  $A_1$  is  $\leq A[q]$ , and every element in  $A_2$  is  $> A[q]$
- **Conquer:** Recursively sort  $A_1$  and  $A_2$
- **Combine:**  $A_1$  concatenated with  $A_2$  is now the sorted version of  $A$

15

## The Algorithm

```
//PRE: A is the array to be sorted, p>=1, and r is <= the size of A
//POST: A[p..r] is in sorted order
Quicksort (A,p,r){
    if (p<r){
        q = Partition (A,p,r);
        Quicksort (A,p,q-1);
        Quicksort (A,q+1,r);
    }
}
```

16

## Partition

```
//PRE: A is the array to be partitioned, p>=1 and r <= size of A
//POST: A[]
Partition (A,p,r){
    x = A[r];
    i = p-1;
    for (j=p;j<=r-1;j++){
        if (A[j]<=x){
            i++;
            exchange A[i] and A[j];
        }
    }
    exchange A[i+1] and A[r];
    return i+1;
}
```

17

## Correctness

Basic idea: The array is partitioned into four regions,  $x$  is the pivot

- Region 1: Region that is less than or equal to  $x$
- Region 2: Region that is greater than  $x$
- Region 3: Unprocessed region
- Region 4: Region that contains  $x$  only

Region 1 and 2 are growing and Region 3 is shrinking

18

## Correctness

Basic idea: The array is partitioned into four regions,  $x$  is the pivot

- Region 1: Region that is less than or equal to  $x$   
(between  $p$  and  $i$ )
- Region 2: Region that is greater than  $x$   
(between  $i + 1$  and  $j - 1$ )
- Region 3: Unprocessed region  
(between  $j$  and  $r - 1$ )
- Region 4: Region that contains  $x$  only  
( $r$ )

Region 1 and 2 are growing and Region 3 is shrinking

19

## Example

- Consider the array (2 6 4 1 5 3)

20

## Loop Invariant

At the beginning of each iteration of the for loop, for any index  $k$ :

1. If  $p \leq k \leq i$  then  $A[k] \leq x$
2. If  $i + 1 \leq k \leq j - 1$  then  $A[k] > x$
3. If  $k = r$  then  $A[k] = x$

21

## In Class Exercise

- Show Initialization for this loop invariant
- Show Termination for this loop invariant
- Show Maintenance for this loop invariant:
  - Show Maintenance when  $A[j] > x$
  - Show Maintenance when  $A[j] \leq x$

22

## Scratch Space

23

## Scratch Space

## Worst Case

- In the worst case, the partition always splits the original list into a singleton element and the remaining list
- Then we have the recurrence  $T(n) = T(n-1) + T(1) + \Theta(n)$ , which is the same as  $T(n) = T(n-1) + \Theta(n)$
- The solution to this recurrence is  $T(n) = O(n^2)$ . Why?

24

27

## Analysis

## Todo

- The function Partition takes  $O(n)$  time. Why?
- Q: What is the runtime of Quicksort?
- A: It depends on the size of the two lists in the recursive calls

- Read Chapter 7
- Finish HW
- Study for Midterm!

25

28

## Best Case

- In the best case, the partition always splits the original list into two lists of half the size
- Then we have the recurrence  $T(n) = 2T(n/2) + \Theta(n)$
- This is the same recurrence as for mergesort and its solution is  $T(n) = O(n \log n)$

26