

## Homework 7

1. 7.4.1 from CLRS on page 184

Show that in the recurrence

$$T(n) = \max_{0 \leq q \leq n-1} (T(q) + T(n-q-1)) + \theta(n)$$

$$T(n) = \Omega(n^2)$$

- Page 180-181: maximum bound of  $T(q) + T(n-q-1)$  is positive with respect to  $q$ . This also means that the bound of  $(q^2 + (n-q-1)^2) \leq (n-1)^2$  is  $n^2 - 2n + 1$
- So we can substitute every value of  $q$  to be  $(n-1)$

$$IH: T(n) \geq dn^2$$

$$\begin{aligned} T(n) &= \max_{0 \leq q \leq n-1} (T(q) + T(n-q-1)) + \theta(n) \\ &\geq d(n^2 - 2n + 1) + \theta(n) \\ &\geq dn^2 - d(2n - 1) + \theta(n) \\ &\geq dn^2 - 2dn + d + cn \\ &\geq dn^2 \text{ if } (-2dn + d + cn) > 0 \text{ and } c > 1 \end{aligned}$$

2. Question 7-1a on page 185 in the textbook.1

HOARE-PARTITION(A, p, r)

x = A[p]

i = p - 1

j = r + 1

**while** TRUE

**repeat**

        j = j - 1

    until A[j] ≤ x

**repeat**

        i = i + 1

    until A[i] ≥ x

**if** i < j

        exchange A[i] with A[j]

**else return** j

a. Demonstrate the operation of HOARE-PARTITION on the array A = (13, 19, 9, 5, 12, 8, 7, 4, 11, 2, 6, 21) showing the values of the array and auxiliary values after each iteration of the while loop in lines 4–13.

- Before the loop:
  - I = 1, A[i] = 13
  - J = 12, A[j] = 21
  - ⟨13, 19, 9, 5, 12, 8, 7, 4, 11, 2, 6, 21⟩
- First iteration:
  - X = 13
  - A[i] = 13, i = 1
  - A[j] = 6, j = 11
  - X = 13 where A[j] ≤ X and A[i] ≥ X
  - 6 ≤ 13 and 13 ≤ 13
  - i < j, swap 13 and 6
  - ⟨6, 19, 9, 5, 12, 8, 7, 4, 11, 2, 13, 21⟩
- Second iteration:
  - X = 13
  - A[i] = 19, i = 2

- $A[j] = 2, j = 10$
  - $X = 13$  where  $A[j] \leq X$  and  $A[i] \geq X$
  - $I < J$ , so swap 19 and 2
  - $\langle 6, 2, 9, 5, 12, 8, 7, 4, 11, 19, 13, 21 \rangle$
- Third iteration:
  - $X = 13$
  - $A[j] = 11, j = 8$
  - $A[i] = 19, i = 9$
  - $J < i$ , so returning  $j$
  - Hoare's partition ends at  $\langle 6, 2, 9, 5, 12, 8, 7, 4, 11, 19, 13, 21 \rangle$

3. If the array contained many duplicate items, which would be a better partitioning algorithm: Hoare, or the one presented in class?

Reference: <https://cs.stackexchange.com/questions/11458/quicksort-partitioning-hoare-vs-lomuto>

Quicksort for both cases risk the worst-case time being  $O(n^2)$ . Whenever quicksort has a bad pivot, the time complexity slowly degrades to the worst case.

Quick sort using a random pivot runs a risk where if a majority of the elements in an array are duplicates, then the pivot will have a high chance of randomly setting one of the duplicate elements as its pivot. If chosen, it will see  $A[j] \leq x$  and swap for every other duplicate element in the array.

- If we have an array of all duplicate elements, then randomized quicksort would always have a worst-case pivot when randomly selecting. Whenever a pivot is chosen, it will swap with every element in the array. This means in an array with all duplicates, every element swaps with every other element, costing  $O(n^2)$  time.

In Hoare's partitioning algorithm, because we check for less than or equal to and greater than or equal to for  $i$  and  $j$ , any duplicate elements found will all be discovered by the pivot and be placed in one of the two sub-arrays. This means that for an array with mostly duplicate elements,  $i$  and  $j$  will always swap when they get a hold of two duplicate elements.

However, Hoare's partitioning algorithm always have  $i$  and  $j$  move closer towards each other with each swap. The greater number of duplicate elements would guarantee a swap, but it also increases the likelihood of  $i$  and  $j$  intersecting their pivots in the middle of the array as they both move towards each other.

- In an array with all duplicate elements, Hoare's partition will have  $i$  and  $j$  swap until they meet in the middle, making this  $O(n \log n)$  time.

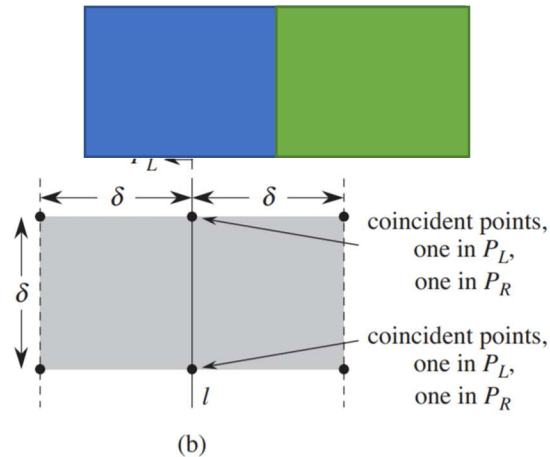
4. Professor Williams (having looked at the proof on page 1041) comes up with a scheme that allows the closest-pair algorithm to check only 5 points following each point in array  $Y'$ . The idea is always to place points on line  $l$  into set  $P_L$ . Then, there cannot be pairs of coincident points on line  $l$  with one point in  $P_L$  and one in  $P_R$ . Thus, at most 6 points can reside in the  $\delta \times 2\delta$  rectangle. What is the flaw in the professor's scheme?

Professor Williams assumes that we can simply compare all points from  $P_L$  to  $P_R$  faster using his method. However, this does not take into account a scenario where all points are in  $P_L$  and no points are in  $P_R$  or a scenario where all points found share the same x-coordinate. It also does not take into account the possibility of an uneven number of points in  $P_L$  and  $P_R$ .

The combine part of the algorithm needs to check the pairs of points between  $P_L$  and  $P_R$  and determine if there is a pair whose distance is less than  $\delta$ . If we use Professor William's method and there are no points in  $P_R$ , then we will fail to merge  $P_L$  and  $P_R$  because William's extra points are searching for a point in  $P_R$  that does not exist.

5. CLRS question 33.4-2 on page 1043

Show that it actually suffices to check only the points in the 5 array positions following each point in the array  $Y'$ .



When judging distances, the maximum number of coincident points we can place would be at each corner of the rectangles. When compare based on a rectangle of size  $\delta \times 2\delta$ , there are 6 coincident points we can place where there would be no comparison overlap.

- We're concerned if two points have a distance  $< \delta$
- Then, if we're presented with two squares of size  $\delta \times \delta$ , the points we would check would avoid overlap by being  $\delta$  distance from each other
  - This  $\delta$  distance would mean each point is placed at each corner of each square

If we place one point at one of the 6 points, then we're left with the other 5 coincident points to check for the smallest distance. Therefore, we only need to check at most 5 other points which don't overlap in a  $\delta \times \delta$  square.

6. CLRS question 33.4-6 on page 1044

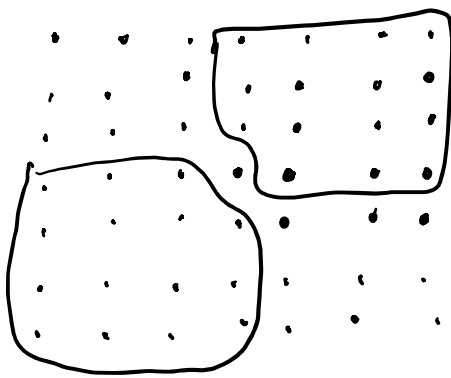
Suggest a change to the closest-pair algorithm that avoids presorting the  $Y$  array but leaves the running time as  $O(n \lg n)$ . (Hint: Merge sorted arrays  $Y_L$  and  $Y_R$  to form the sorted array  $Y$ .)

The main algorithm already splits the distance  $Y$  into  $Y_L$  and  $Y_R$ . recursively, we can put them back together in  $O(n \log n)$  time. We apply a merge step on  $Y_L$  and  $Y_R$  and have them merge back into  $Y$ . While merging, we would return the points found based on the order of their  $Y$ -coordinates. Since merging two arrays is done in  $O(n)$  time, the overall runtime is not affected and will remain to be  $O(n \log n)$ .

7. In the  $O(n)$  worst case deterministic select algorithm, the pivot was found by dividing the input elements into groups of 5 and then finding the median of their medians. Would the algorithm still run in  $O(n)$  time if we divided the elements into groups of 7 instead of 5? Would the algorithm still run in  $O(n)$  time if we divided the elements into groups of 3 instead of 5? Prove your answer. \*Many of these questions came from outside sources. <sup>1</sup>

$n$  elements will be divided into groups of size 7. Our # of median elements  $< x$  would be  $n/7$ . Because it takes  $O(1)$  to find a median in a pool of constant numbers, we can find our pool of median representatives in  $n/7 * O(1)$  time which is still  $O(n)$  time.

- Time to partition into 7 groups:  $O(n)$  time
- Time to group and find the median representatives:  $T(n/7)$
- The time to check the elements that weren't discarded after checking the median representatives:  $\lceil \frac{7}{2} \rceil = 4$  groups to check after searching the medians
  - $T\left(\frac{14-4}{14} * n\right) = T\left(\frac{10n}{14}\right)$  elements to check from the remaining partitions



$\frac{n}{7}$  medians partitions

$\lceil \frac{7}{2} \rceil = \frac{4n}{7}$  medians to check

$\frac{10n}{14}$  remaining elements to check

$$T(n) = T\left(\frac{n}{7}\right) + T\left(\frac{5n}{7}\right) + \theta(n)$$

$$IH: T(n) \leq dn$$

$$T(n) \leq d * \frac{n}{7} + d * \frac{5n}{7} + cn$$

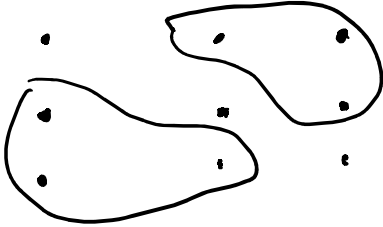
$$T(n) \leq \frac{6d}{7} + cn$$

$$\leq O(n) \text{ if } c < \frac{1}{7}$$

This would cost less than  $O(n)$  only if our constant time is less than  $1/7$ .



If we divided it into groups of size 3, it would take  $n/3 * O(n)$  time to search for an element and group the elements into partitions based on their medians. It would also cost  $T(2n/3)$  time to check the upper/lower elements and discard them during comparisons after the median was found.



$T(\frac{n}{3})$  for groups of 3

$\lceil \frac{3}{2} \rceil = \frac{2n}{3}$  medians to check

$\frac{6-2}{6} = \frac{4n}{6}$  elements after discarding

- Time to partition into groups of size 3 would be  $O(n)$  time
- Time to select the median of medians would be  $T(n/3)$
- After selecting the median of medians, we would have to check  $\lceil \frac{3}{2} \rceil = 2$  medians to see which group to search through
  - This leaves us with  $T(\frac{6-2}{6}n) = T(\frac{4n}{6})$  elements to search through

$$T(n) = \theta(n) + T\left(\frac{n}{3}\right) + T\left(\frac{2n}{3}\right)$$

IH checking for  $\Omega$ :  $T(n) \geq dn$

$$\begin{aligned} T(n) &\geq cn + d * \frac{n}{3} + d * \frac{2n}{3} \\ &\geq cn + dn \end{aligned}$$

Using induction, when handling groups of size 3, our selection algorithm is  $\Omega(n)$

8. Suppose University X (UX) is electing its student-body president. Suppose further that everyone at UX is a candidate and voters write down the student number of the person they are voting for, rather than checking a box. Let A be an array containing n such votes, that is, student numbers for candidates receiving votes, listed in no particular order.

- Your job is to determine if one of the candidates got a majority of the votes, that is, more than  $n/2$  votes. Describe an  $O(n)$  worst case time algorithm for determining if there is a student number that appears more than  $n/2$  times in A.

- Consider the election problem from the previous exercise, but now describe an algorithm running in  $O(n)$  worst case running time to determine the student numbers of every candidate that received more than  $n/3$  votes. This question is modified from questions in Goodrich, Michael T.; Tamassia, Roberto. Algorithm Design and Applications

- If majority means  $> n/2$ , then we can use deterministic selection to find the list
- If an element is in the majority, then it would be counted the most when iterating over the array
- So we could just go over the list and count the element in our array. If we have a majority element, it would be the last element

1	2	4	1	1	1	2
---	---	---	---	---	---	---

For the array above, the number of occurrences for each element would be

- #1: 4 occurrences
- #2: 2 occurrences
- #4: 1 occurrence
- We can create a hash map which will be used to keep track of what candidates we have based on their collisions
  - This hash map will also include satellite data counting every collision or vote we received for that candidate
  - Every collision found will increase the counter for that candidate's votes
- After counting all votes, we can go over the hash map list and check for the candidate who has  $> n/2$  votes
- This process will take  $O(2n)$  if every element is unique because then we would end up with a hash map of size  $m = n$  and find out that there is no majority winner.
- We only need to traverse the list once and the hash map once, making this  $O(n)$

ELECTION(A)

//Where array A contains the student votes

Create Hash Table LIST that has counter as satellite data

//  $\theta(n)$  time

For i = 1 to A.length

```
    If HASH(A[i]) does not have a collision with LIST
//Assuming no unintentional collisions between two different candidates
        Hash-Insert HASH(A[i]) into LIST
        LIST(H(A[i])).counter = 1 //Add satellite data for the counter
        List(H(A[i])).index = i
    Else //Collision found
        LIST(H(A[i])).counter++ //Increment the counter
EndFor

//Go over the hash table we have and count the collisions
// $\theta(k)$  time where  $k \leq n$ 
For (i = 1 to LIST.length)
    If(LIST[i].counter > n/2)
        Print A[List[i].index] //Print the candidate
    Return
EndFor

//If we have reached this point and not returned, that means there was no majority candidate found
Print "There is no majority candidate"
```

- To find the candidates with over  $n/3$  votes, our hash map already creates a list of how many votes each candidate receives.
- We can simply go over the hash map and look for any candidate that has  $> n/3$  votes.
- This still runs in  $O(2n)$  which is still  $O(n)$  because we're traversing the array and hash map once.

The function is the same as before except we check the hash table for any candidate with  $n/3$  collisions

//Where array A contains the student votes

Create Hash Table LIST that has counter as satellite data

For i = 1 to A.length

If HASH(A[i]) does not have a collision with LIST

Brandon Vo

Hash-Insert HASH(A[i]) into LIST

LIST(H(A[i])).counter = 1 //Add satellite data for the counter

List(H(A[i])).index = i

**Else**

LIST(H(A[i])).counter++ //Increment the counter

**EndFor**

**Bool** FOUND = FALSE

**For** (i = 1 to LIST.length)

**If**(LIST[i].counter >  $n/3$ )

**Print** A[LIST[i].index]

FOUND = TRUE

**EndFor**

**If** (!FOUND)

**Print** "There is no candidate with  $1/3$  of the votes"

9. (3 bonus points) Think of a good exam/homework question for the material covered in Lecture 7.

What would our run-time be if we used deterministic selection to partition  $n$  elements into groups of size  $k$  where  $k < n$ ? How would that run-time be affected if we used quick-sort or merge-sort to arrange the median representatives?