# EECS 3101 M: Design and Analysis of Algorithms

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Course page: http://www.eecs.yorku.ca/course/3101M Also on Moodle

### **Computing Order Statistics**

Order statistics: The  $i^{th}$  order statistic of n elements  $a_1, a_2, \ldots, a_n$  is the  $i^{th}$  smallest element

- Special cases: Minimum and maximum, Median
- How do we find the *i*<sup>th</sup> order statistic?

Already seen:

- k = 1:  $\Theta(n)$  algorithm, optimal
- Also, Build-Heap + Extract-max:  $\Theta(n)$  algorithm
- Same bounds hold for any constant k
- Sorting solves it for any  $k: \Theta(n \log n)$  algorithm
- What about k = n/2? Can we do better than  $\Theta(n \log n)$ ?

#### Computing Order Statistics - 2

To select the  $i^{th}$  order statistic:

- Can we use PARTITION?
- if we are very lucky, we will get it in the first try!
- otherwise we should have a smaller set to recurse on.
- No guarantee of being lucky!
- How can we guarantee a significantly smaller set?

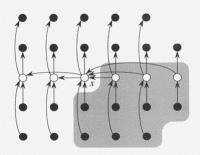
The algorithm is the most complicated divide-and-conquer algorithm in this course!

## Computing Order Statistics: Algorithm SELECT

- Divide *n* elements into  $\lceil n/5 \rceil$  groups of 5 elements.
- Find the median of each group.
- Use SELECT recursively to find the median x of the above [n/5] medians.
- Partition using x as pivot, and find position k of x
- If i = k return
- else recurse on the appropriate subarray.

What kind of split does this produce?

#### Algorithm SELECT - 2



**Figure 9.1** Analysis of the algorithm SELECT. The *n* elements are represented by small circles, and each group occupies a column. The medians of the groups are whitened, and the median-of-medians *x* is labeled. (When finding the median of an even number of elements, we use the lower median.) Arrows are drawn from larger elements to smaller, from which it can be seen that 3 out of every full group of 5 elements to the right of *x* are greater than *x*, and 3 out of every group of 5 elements to the left of *x* are less than *x*. The elements greater than *x* are shown on a shaded background.

## **SELECT** - Analysis

- Steps 1,2,4 take O(n)
- Step 3 takes  $T(\lceil n/5 \rceil)$
- Step 5: At least half of medians in step 2 are ≥ x, thus at least [1/2[n/5]] 2 groups contribute 3 elements which are ≥ x
  i.e., 3([1/2[n/5]] 2) ≥ (3n/10) 6
- Similarly, the number of elements ≤ x is also at least (3n/10) 6 Thus, |S<sub>1</sub>| is at most (7n/10) + 6, similarly for |S<sub>3</sub>|
- Thus SELECT in step 5 is called recursively on at most (7n/10) + 6 elements.

### SELECT - Recurrence

Recurrence is:

$$T(n) = O(1) \text{ if } n < 140$$
  
=  $T(\lceil n/5 \rceil) + T(7n/10+6) + O(n) \text{ if } n \ge 140$ 

Show  $T(n) \leq cn$ , for some c > 0

## SELECT - 2

$$T(n) \leq c \lceil n/5 \rceil + c(7n/10+6) + an$$
  

$$\leq cn/5 + c + 7/10cn + 6c + an$$
  

$$= 9/10cn + an + 7c$$
  

$$= cn + (-cn/10 + an + 7c)$$
  

$$\leq cn \text{ if}$$
  

$$-cn/10 + an + 7c < 0$$
  

$$c \geq 10a(n/(n-70)) \text{ when } n > 70$$

So select n = 140, and then  $c \ge 20a$ Note: *n* need not be 140, any integer > 70 is OK

#### Exercise

Describe an O(n) algorithm that, given a set S of n distinct numbers and a positive integer  $k \le n$ , determines the k numbers in S that are closest to the median of S.