

CSC 317: Data Structures and Algorithm Analysis

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Outline I

- Order Statistics
- Minimum and maximum
- Selection in worst-case linear time

Order Statistics

- The i th **order statistic** of a set of n elements is the i th smallest element.
- Minimum is the 1st order statistic, because $i = 1$.
- Maximum is the n th order statistic, because $i = n$.
- A **median** is a “halfway point”
- If n is odd, the unique **median** is $(n + 1)/2$
- If n is even, there are two **medians**
 - The *lower median* occurring at $n/2$, and
 - The *upper median* occurring at $(n/2 + 1)$.

The SELECTION problem.

- **Input:** A set A of n (distinct) numbers and an integer i
 - such that $1 \leq i \leq n$
- **Output:** The element $x \in A$ that is greater than exactly $(i - 1)$ other elements of A .

Selection of min with $(n - 1)$ comparisons

- **A[1..n]** is an array of n elements
- min holds the minimum value found, and
- $A.length$ is the number of elements in A
- Line 1: initial **minimum** is **A[1]**
- Line 2: a for loop that executes $(A.length)$ times
 - Why?
- Line 3: executes $(A.length - 1)$ times
- Line 4: in executes $(A.length - 1)$ times, in the worst-case
- Line 5: returns the minimum value found

```

MINIMUM(A)
1  min = A[1]
2  for i = 2 to A.length
3      if min > A[i]
4          min = A[i]
5  return min
  
```

- What is the complexity of the algorithm?
- $(n - 1)$ comparisons are performed in the loop
- How do we prove correctness of the algorithm?
- Use **loop invariant**
- How many comparisons are necessary to find both **minimum** and **maximum**?

Selection of min and max with $3 \lfloor n/2 \rfloor$ comparisons

- We can find the *min* and *max* in $(2n - 2)$ comparisons
- Modify MINIMUM(*A*)
- But we can find both **min** and **max** together
- The algorithm is shown to the right for odd *n*
- Line 02 and 03: initialize **min** and **max**
- Line 04: **for loop** is executed only $n/2$ times
- Lines 05 to 14: in the **for loop** only **three** comparisons are made
- Total comparisons are $3 \lfloor n/2 \rfloor$
- How many comparisons are necessary to find *k*th element for $2 \leq k \leq (n - 2)$?
- Can we do it in linear time?
- Yes, use **divide-and-conquer** algorithm

```

MINUMUN-MAXIMUM(A)
01 Assume number of elements n is odd
02   min = A[1]
03   max = A[1]
04   for i = 1 to (A.length/2)
05     if A[2*i] > A[2*i + 1]
06       if min > A[2*i + 1]
07         min = A[2*i + 1]
08       if max < A[2*i]
09         max = A[2*i]
10     else {A[2*i] < A[2*i + 1]}
11       if min > A[2*i]
12         min = A[2*i]
13       if max < A[2*i + 1]
14         max = A[2*i + 1]
15   return min max
  
```

Selection in worst-case linear time selection: An example

- Let us consider an example first
- suppose we have 75 unordered integers
- We want to find 17th integer
- Step 1: Arrange the elements into five rows

Selection in worst-case linear time selection : An example

- Let us consider an example first
- suppose we have 75 unordered integers
- We want to find 17th integer
- Arrange the elements into five rows

71	31	77	10	88	13	55	41	60	25	52	38	82	4	19
74	37	68	9	93	16	61	47	68	31	57	41	84	3	21
69	33	79	11	90	19	57	98	65	26	54	39	86	6	25
73	36	78	8	92	18	59	97	66	30	53	42	85	1	22
70	34	67	12	91	14	62	42	63	28	58	44	83	7	24

- Sort each column in increasing order, from top

Selection in worst-case linear time selection : An example

- We get

69	31	67	8	88	13	55	41	60	25	52	38	82	1	19
70	33	68	9	90	14	57	42	63	26	53	39	83	3	21
71	34	77	10	91	16	59	47	65	28	54	41	84	4	22
73	36	78	11	92	18	61	97	66	30	57	42	85	6	24
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- Third-row is the median of each column

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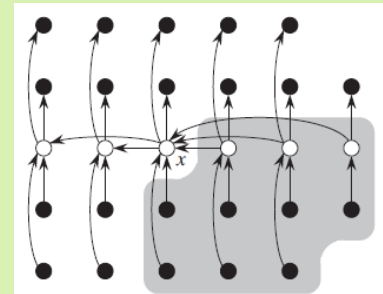
- Third-row is the median of each column
- The algorithm works on the elements of the 3rd row
- Recursively, it finds the median of this row
- After finding the median value, the size of the problem is reduced

Selection in worst-case linear time selection : An example

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- The median value of the middle row is 47
- Seven values smaller than 47 are 34, 10, 16, 28, 41, 4, and 22
- Minimum # of values smaller than 47 are:
 - (Two values above 8 medians) + (7 medians smaller than 47)
 - $2 \times 8 + 7 = 23$ values in the **green circles** are smaller than 47
- Similarly, 23 values in the **red circles** are bigger than 47
- Since we want to find 17th integer, we can eliminate 23 values in the red circles,
- We now have to find the 17th integer from $(75-23) = 52$ integers

Selection in worst-case linear time selection : An example

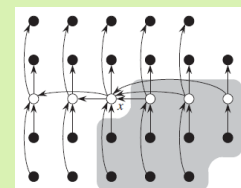


- Out of 75 integer, 23 are eliminated from selection at the first step!
- This is about 30%
- This elimination of about 30% continues, until
 - The desired 17th integer is found, or
 - The list is small enough to sort and
 - The desired 17th integer is directly selected
- The figure above is from the textbook
- It shows the same concept, but little abstract
- Lets put everything together as an algorithm

Selection in worst-case linear time selection

```

SELECT(ith, n, a1, a2, ..., an)
01 Divide a1, a2, ..., an into groups of 5
02 Find medians m1, m2, ..., mn/5 of n/5 groups
03 x = SELECT(n/10, n/5, m1, m2, ..., mn/5)
04 k = rank(x) { by counting number of elements }
05 { smaller than x; this takes linear time }
06 if i == k { Case 1 }
07     return x
08 else if (i < k) { Case 2 }
09     b[] = all items of a[] less than x
10     return SELECT(ith, k - 1, b1, b2, ..., bk-1)
11 else if (i > k) { Case 3 }
12     c[] = all items of a[] greater than x
13     return SELECT((i - k)th, n - k, c1, c2, ..., cn-k)
    
```



Selection Algorithm Analysis

- $T(n)$ be the time complexity
- Lines 01, 02, 04, 07, 08, 11 takes $c_1 n = O(n)$ time
- Line 03 takes $T(n/5)$ time (approximately)
- Line 09 and 10 OR 12 and 13 are executed
- They take $T(7n/10)$ time, thus
- $T(n) \cong T(n/5) + T(7n/10) + cn$