

Recorded Lecture

Problem find max element in an array  $A[1 \dots n]$ , and where max is located.

A solution :

FindMax( $A, n$ )

1.  $\text{max} = A[1]$

2.  $\text{imax} = 1$

3. for  $i = 2$  to  $n$

4.     if  $A[i] > \text{max}$

5.          $\text{max} = A[i]$

6.          $\text{imax} = i$

7. return ( $\text{max}, \text{imax}$ )

basic operation

Runtime :  $T(n) = n-1 = \Theta(n)$

## Decision Tree argument:

$$k = 2, f(n) = n$$

$$\text{lower-bound: } \lceil \lg n \rceil$$

## Adversary Argument

consider any algorithm for this Problem,  
and run it on an array of length  $n$ .

The adversary's strategy is to answer  
each Probe as if  $A[i] = i$  for  $i = 1 \dots n$ .  
i.e. as if

$$A = (1, 2, 3, \dots, n)$$

i.e. in response to Probe:  $A[i] < A[j]$ ,  
the answer is

(we say)

$$\begin{cases} \text{true} & \text{if } i < j \text{ (i has lost)} \\ \text{false} & \text{if } i > j \text{ (j has lost)} \end{cases}$$

Now assume the algorithm halts and returns the output

$$(A[k], k)$$

after doing fewer than  $h(n) = n - 1$  comparisons.

Let  $i$  be an int in range  $1 \leq i \leq n$  such that  $i \neq k$ , and  $i$  as not lost any comparisons. Such an index  $i$  must exist since, by our assumption only  $n - 2$  comparisons have been performed, and each comparison creates at most one new loser.  $\therefore$  there are at most  $n - 2$  losers, hence at least 2 indices have never lost a comparison.

At this point the adversary can claim

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$$* \quad A[i] = \begin{cases} i & \text{if } i \neq j \\ n+1 & \text{if } i = j \end{cases}$$

Note:  $A[k] = k$  is not maximum in this array,  $A[j] = n+1$  is maximum.

Also the adversary's seq. of answers are all consistent with this array \*.

We conclude, any correct algorithm must do at least  $h(n) = n-1$  comparisons to find max in an array of len.  $n$ .



Ex.

Let  $G = (V, E)$  be a graph on  $|V| = n \geq 2$  vertices. Determine whether  $G$  is connected or disconnected. We consider algorithm that ask only 'adjacency' questions, or 'edge probes' i.e. "is  $x$  adjacent to  $y$ " i.e. "does edge  $\{x, y\}$  exist in  $E$ "

Decision Tree lower-bound

#arity of questions =  $k = 2$

#outcomes or verdicts =  $f(n) = 2$

lower bound =  $\lceil \lg(2) \rceil = 1$

## Adversary Argument

Consider any algorithm for this Problem that asks only 'adjacency' questions, and run it against an adversary simulating a graph with  $n$  vertices ( $n \geq 2$ ).

adversary strategy:

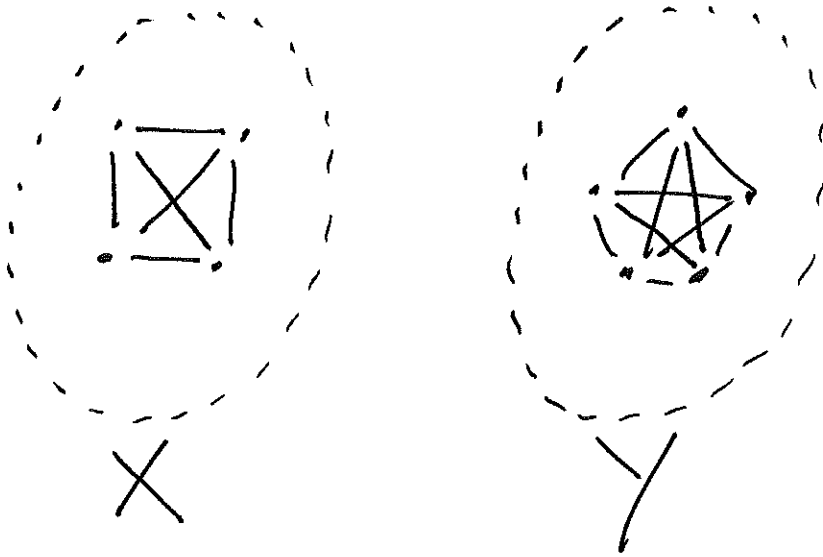
Partition  $V$  into  $X, Y \subseteq V$  of sizes  $|X| = \lfloor n/2 \rfloor$  and  $|Y| = \lceil n/2 \rceil$ . Thus

$$X \cup Y = V \text{ and } X \cap Y = \emptyset.$$

when algorithm probes " $\{x, y\} \in E$ ", the answer given is

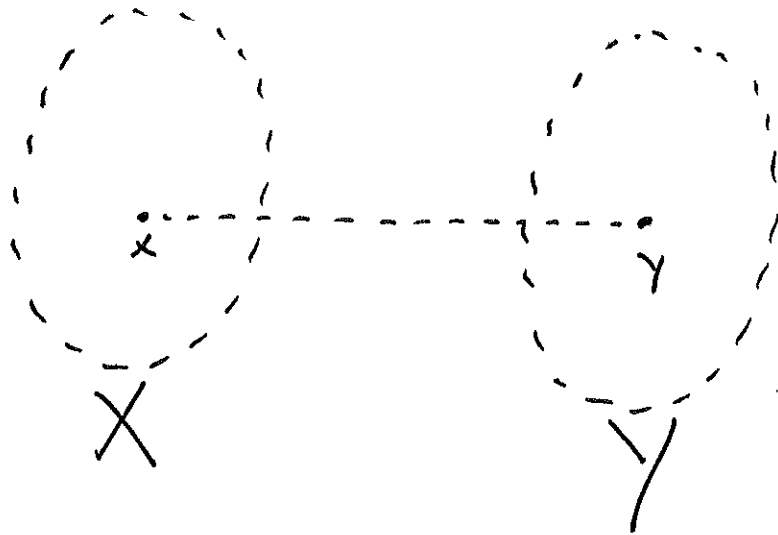
$$\begin{cases} \text{yes} & \text{if } x, y \in X \text{ or } x, y \in Y \\ \text{no} & \text{if } x \in X, y \in Y \text{ or } x \in Y, y \in X \end{cases}$$

i.e. adversary answers as if  $G$  consists of disjoint union of two complete <sup>sub-</sup>graphs



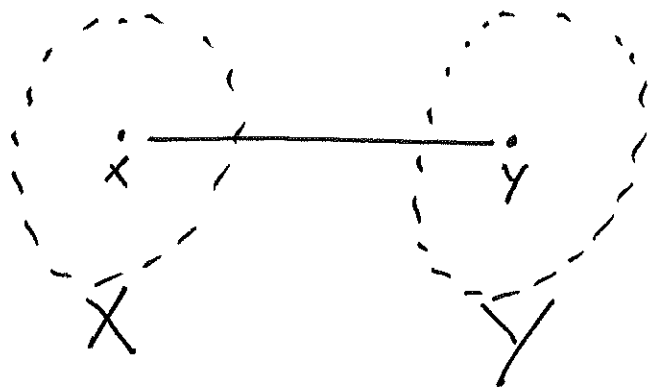
Suppose algorithm halts and returns an output (connected/disconnected) after asking fewer than  $h(n) = \lfloor \frac{n}{2} \rfloor \cdot \lceil \frac{n}{2} \rceil$

questions. Then there must exist vertices  $x \in X$  and  $y \in Y$  such that  $\{x, y\}$  was not probed.



If the algorithm says  $G$  is connected,  
then adversary can claim  $G$  consists  
of 2 complete graphs on  $X, Y$ .

If algorithm says  $G$  is disconnected,  
adversary can claim  $G$  consists of



a complete graph on  $X$ , a complete graph  
on  $Y$ , and a single edge from  $x$  to  $y$ .



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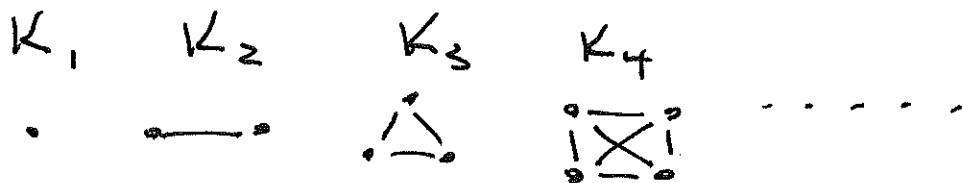
So any correct algorithm must do  
at least  $h(n) = \lfloor \frac{n}{2} \rfloor \cdot \lceil \frac{n}{2} \rceil$  edge

Probes . ■

### Remarks

- $h(n) = \lfloor \frac{n}{2} \rfloor \lceil \frac{n}{2} \rceil = \Theta(n^2)$  . actually  
 $h(n) = \frac{1}{4}n^2 + o(n^2)$  ,  $h(n) \sim \frac{1}{4}n^2$
- DFS can solve this problem in  
time  $\Theta(n^2)$  , if we represent  $G$   
as an adjacency matrix .
- note  $|E(K_n)| = \binom{n}{2} = \frac{n(n-1)}{2} = \frac{1}{2}n^2 - \frac{1}{2}n$   

$\uparrow$   
 complete graph  
 on  $n$  vertices



Theorem

At least  $\binom{n}{2}$  adjacency questions are necessary (in worst case) to determine whether a graph<sub>n</sub> is connected.  
on  $n$  vertices

Proof ... next time ...