

## Lecture 5:

- Greedy algorithms vs. Sublinear time:  
the case of maximal matching

- Property Testing:

is the graph planar?


# Sublinear time algorithms via greedy:


We focus on problem of

estimating size of maximal matching (MM)  
in degree bounded graph

Why?

- step towards approx maximum matching problem
- relation to Vertex Cover (VC)

$|VC| \geq |MM|$  ← for each edge in matching  
 u or v has to be in VC  
+ matching edges are node-disjoint  
*true for any matching not just maximal*

$|VC| \leq 2 \cdot |MM|$  ← put all nodes in MM into VC  
  $(u,v) \in MM$  put  $u,v$  into VC  
why is this VC? if any edge not covered by VC we can add to MM → ←

Contradicts  
maximality of MM

Note (similar to VC)

if degree  $\leq \Delta$ , maximal matching  $\geq \frac{m}{2\Delta}$

why? run process  
when place edge  $(u,v)$  into MM  
delete other edges of  $u$  or  $v$   
( $\leq 2\Delta$ ) which can no longer be  
in matching  
all other edges are fair game

Greedy Sequential Matching Algorithm:

$M \leftarrow \emptyset$

one by one  
(in some order)

$\forall e = (u,v) \in E$

if neither  $u$  or  $v$  matched

add  $e$  to  $M$

previously  
in this  
order

Output  $M$

Observation:

$M$  is maximal

why? if  $e \notin M$   
"  
 $(u,v)$

then either  $u$  or  $v$  already  
matched

# Oracle Reduction Framework: (Parnas - Ron)

Assume given deterministic "oracle"  $\mathcal{O}(e)$   
which tells you if  $e \in M$  or not in one step

## Algorithm to estimate $|M|$ :

- $S \leftarrow$  set of  $s = \frac{8}{\epsilon^2}$  nodes chosen iid
- $\forall v \in S$   
let  $X_v \leftarrow \begin{cases} 1 & \text{if any call to } \mathcal{O}(v, w) \text{ for } w \in N(v) \\ & \text{returns "yes"} \\ 0 & \text{o.w.} \end{cases}$
- Output  $\frac{n}{2s} \sum_{v \in S} X_v + \frac{\epsilon}{2} \cdot n$   

↑ since 2 nodes are matched for each edge in  $M$

average # nodes matched in sample

unlikely to underestimate

Behavior of output:  
(why a good approximation?)

- $S \leftarrow$  set of  $s = \frac{8}{\epsilon^2}$  nodes chosen iid
- $\forall v \in S'$   
let  $X_v \leftarrow \begin{cases} 1 & \text{if any call to } \mathcal{O}(v, w) \text{ for } w \in N(v) \text{ returns "yes"} \\ 0 & \text{o.w.} \end{cases}$
- Output  $\frac{n}{2s} \sum_{v \in S'} X_v + \frac{\epsilon}{2} \cdot n$

note  $|M| = \frac{1}{2} \sum_{v \in V} X_v$

$$E[\text{output}] = E\left[\frac{n}{2s} \sum_{v \in S'} X_v\right] + \frac{\epsilon}{2} n$$

$$= \frac{n}{2s} \sum_{v \in S'} E[X_v] + \frac{\epsilon}{2} n$$

← but  $E[X_v] = \frac{2|M|}{n}$

$$= \cancel{\frac{n}{2s}} \cdot \cancel{s} \cdot \cancel{\frac{2|M|}{n}} + \frac{\epsilon}{2} n$$

$$= |M| + \frac{\epsilon}{2} \cdot n$$

$$\Pr\left[\left|\frac{n}{2s} \sum_{v \in S'} X_v + \frac{\epsilon}{2} n - E[\text{output}]\right| \geq \frac{\epsilon}{2} n\right] \leq \frac{1}{3} \text{ by}$$

additive Chernoff Hoeffding

$$\Pr\left[\left|\frac{n}{2s} \sum_{v \in S'} X_v - |M|\right| \geq \frac{\epsilon}{2} n\right]$$

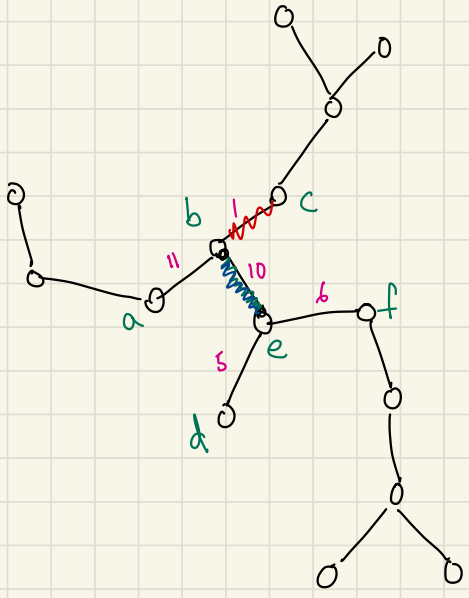
Claim with prob  $\geq 2/3$ ,  $|M| \leq \text{output} \leq |M| + \epsilon \cdot n$



# Implementing the oracle:

Main idea: figure out "what would greedy do on  $(v,w)$ ?"

how?  
which input order?  
do we need to figure out all past choices?

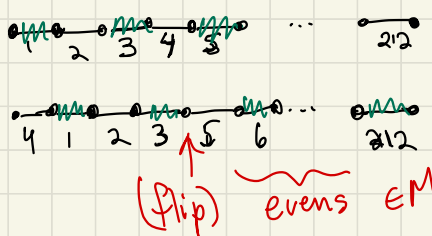


Is  $(b,e) \in M$ ?  
adjacent edges:  
 $(b,c), (a,b), (d,e), (e,f)$   
1    11    5    6  
—             —           
          comes after 10

since  $(b,c)$  is 1st edge considered  
 $(b,c) \in M$   
 $\Rightarrow (b,e) \notin M$

Problem: Greedy is "sequential" + has long dependency chains?

example:



even if you know graph is line but don't know greedy order

Saving grace: assume random order

Implementation of oracle:

Input: edge  $e$

Output: is  $e \in M$ ?

Algorithm:

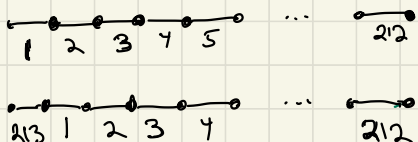
- recursively find all decisions for adjacent edges with lower ordering number

(do not need to know what greedy did on higher order #'s since not considered before  $e$ )

- if any adj. edge with lower number is matched then  $e$  is not matched  
else  $e$  is matched

Problem: Greedy is "sequential" + has long dependency chains?

example:

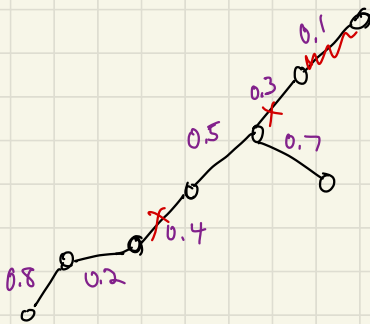


even in line  
is  $e$  is  
odd or even  
in dependency  
chain

How to break length of dependency chains?

assign random ordering to edges  
(ranks are numbers  $\in [0,1]$ )

Example:



Is edge 0.5 in  $M$ ?

recurse on 0.3

recurse on 0.1

no other adjacent edges so added to  $M$

so 0.3 not matched

no need to recurse on 0.7

recurse on 0.4

recurse on 0.2

all of 0.2's nbrs are bigger so

$0.2 \in M$

so  $0.4 \notin M$

so greedily puts  $0.5 \in M$



# Implementation of oracle:

assume ranks  $r_e$  <sup>(opt)</sup> assigned to each edge  $e$

to check if  $e \in M$ :

$\forall e'$  neighboring  $e$ ,

• if  $r_{e'} < r_e$  recursively check  $e'$

+ if  $e' \in M$ , return " $e \notin M$ " + halt

else continue

return " $e \in M$ "

↑ since no  $e'$  of lower rank is in  $M$

Correctness: exactly following greedy  
so follows from correctness of greedy

Query complexity:

Claim expected # queries to graph per oracle query is  $2^{O(d)}$

Claim + Parnas-Ron oracle reduction  $\Rightarrow$  total query complexity

to estimate  $MM$  is  $\frac{1}{\epsilon^2} \cdot 2^{O(d)}$

## Pf of Claim:

- Consider query tree:

root node labelled by original query edge  
children of each node are all adjacent edges

- will only go down paths that are decreasing in rank

- $\Pr[\text{given path of length } k \text{ explored}]$   
 $= \frac{1}{k!}$

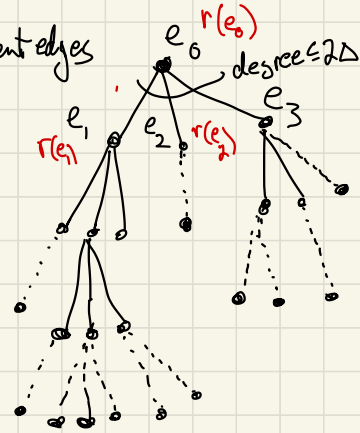
- # edges in original graph at dist =  $k$  in tree is

$$E[\text{\# edges explored at dist } k] \leq \frac{(2\Delta)^k}{k!} = (2\Delta)^k$$

$$E[\text{total \# edges explored}] \leq \sum_{k=0}^{\infty} \frac{(2\Delta)^k}{k!}$$

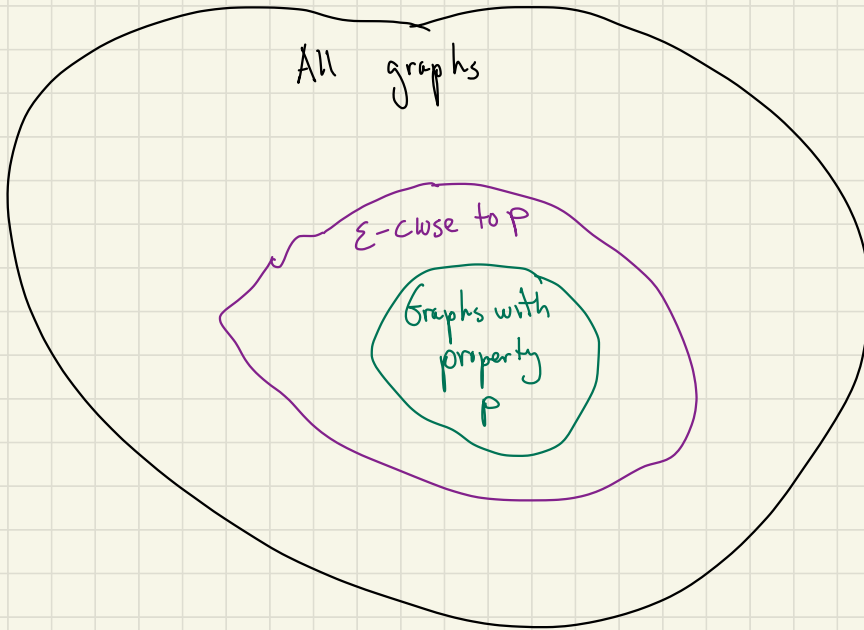
$$\leq e^{O(\Delta)} = \frac{e}{\Delta}$$

$\forall e'$  neighboring  $e$ ,  
if  $r_{e'} < r_e$  recursively check  $e'$   
if  $e' \in M$ , return " $e \notin M$ " + halt  
else continue  
return " $e \in M$ "



# Property Testing

examples of  $P$ :  
planar  
bipartite  
no small cuts  
no triangles  
connected



Can we distinguish graphs with property  $P$   
from far from  $P$ ?

e.g.  $G$  is  $\epsilon$ -far from planar  
if must remove  $\geq \epsilon \cdot \Delta \cdot n$   
edges to make it planar