

Lecture 6:

Sublinear time algorithms

via

simulating greedy algorithms

## Matching:

$M \subseteq E$  is "matching" if  $\forall v \in V,$

$v$  is in at most one edge in  $M$

"maximum matching": largest  $|M|$

"maximal matching": can't add any other edge & make it bigger

← greedy algorithm



$\{a, c\}$  maximum & maximal matching  
 $\{b\}$  is maximal matching

## Today's goal:

Estimate size of maximal matching in degree bounded graph.

Why?

• relation to vertex cover:

$VC \geq MM$  ← for each edge in matching,  $\geq 1$   
endpt must be in VC

↓ these are disjoint

$VC \leq 2 \cdot MM$  ← put all MM nodes in VC  
if any edge not covered by VC,  
violates maximality of MM

⇒ 2-approx to VC

• a step towards approx maximum matching

Note: if  $\deg \leq \Delta$ , maximal matching is  $\geq n/\Delta$

see this by running greedy algorithm.  
each step removes  $\leq 2\Delta$  edges

so size of matching  $\cdot 2\Delta \geq m$

⇒ size of MM  $\geq \frac{n \cdot \text{ave deg}}{2 \cdot \text{max degree}}$

## Greedy sequential matching:

$$M \leftarrow \emptyset$$

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

if neither  $u, v$  matched  
add  $e$  to  $M$

Output  $M$

output only  
depends on  
ordering of  
input edges

observe:  $M$  maximal since if  $e \notin M$ , either  $u$  or  $v$   
 $(u, v)$  already matched earlier

## Oracle reduction framework:

assumption: given deterministic oracle  $O(e)$   
which tells you if  $e \in M$  or not  
in one step.

Reduction algorithm:

at least  $\Omega(\frac{1}{\epsilon})$  fraction  
of nodes in  $M$

•  $S \leftarrow s = \Theta(\frac{n}{\epsilon^2})$  nodes chosen iid

•  $\forall v \in S$

$X_v = \begin{cases} 1 & \text{if any call to } O((v,w)) \text{ for } w \in N(v) \\ & \text{returns "yes"} \\ 0 & \text{o.w.} \end{cases}$

$v$  is  
matched

• Output  $\frac{n}{2s} \sum_{v \in S} X_v + \frac{\epsilon}{2} \cdot n$

since 2 nodes  
matched for each  
edge in  $M$

makes underestimate  
unlikely

Behavior of output: why does it work?

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

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

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

$$E[X_v] = \frac{2|M|}{n}$$

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

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

$$\Pr \left[ \left| \text{output} - E[\text{output}] \right| \geq \frac{\varepsilon n}{2} \right]$$

||

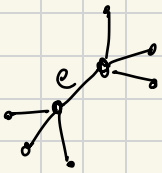
$$\Pr \left[ \left| \frac{n}{25} \sum_{res} E[X_{i,r}] - |M| \right| \geq \frac{\varepsilon}{2} n \right] < \frac{1}{3} \quad \text{by additive Chernoff-Hoeffding} \quad \blacksquare$$

# How do you implement the oracle?

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

how?  
according to which input order?  
do we need to figure out greedy decisions on all earlier nodes?

## Implement oracle based on greedy?



To decide if edge  $e$  in matching:

- need to know decisions for adjacent edges that came **before**  $e$  in ordering
- do not need to know anything about edges **after**  $e$  in ordering since not considered by greedy until after  $e$  is processed.

processing  $e$  (high level):

(recursively) call procedure on all edges adjacent to  $e$  +  
before  $e$  in ordering

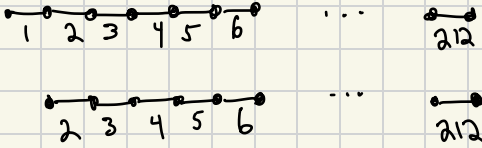
if any adjacent edge before  $e$  in ordering is matched,

then  $e$  is not matched

else  $e$  is matched

problem greedy is "sequential"  
 can have long dependency chains

example:



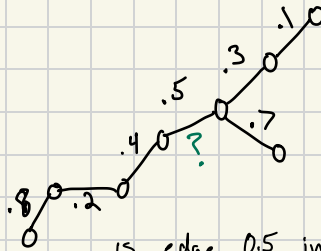
even if you know the graph is a line, how do you know if every edge is odd or even in the order?

"break" length of dependency chains?

idea: assign random ordering to edges

↑  
via random # in  $[0,1]$

example



is edge 0.5 in  $M$ ?



- recurse on 0.3
  - recurse on 0.1
    - no other adjacent edges so match 0.1
    - so don't match 0.3
  - don't recurse on 0.7 since bigger
- recurse on 0.4
  - recurse on 0.2
    - don't recurse on 0.8 since bigger
  - match 0.2
  - don't match 0.4
- match 0.5



## Implementation of oracle

assume random ranks  $r_e$  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? follows from correctness of greedy

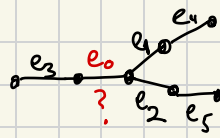
query complexity?

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

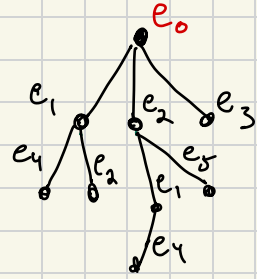
← poly  $d$  is achievable if recurse "smallest first"

Claim  $\Rightarrow$  total query complexity is  $\frac{2^{O(\Delta)}}{\epsilon^2}$

## pf of claim:



- Consider query tree where root node labelled by original query edge.
- Children of each node are labelled by adjacent edges.



- algorithm only queries tree paths that are monotone decreasing in rank

- $\Pr[\text{path } p \text{ of length } k \text{ explored}] = \frac{1}{(k+1)!}$   
← represents  $k+1$  edges

- # edges in original graph at dist  $k$  in tree  $\leq (2\Delta)^k$

- $E[\# \text{ edges explored at dist } k] \leq \frac{(2\Delta)^k}{(k+1)!}$

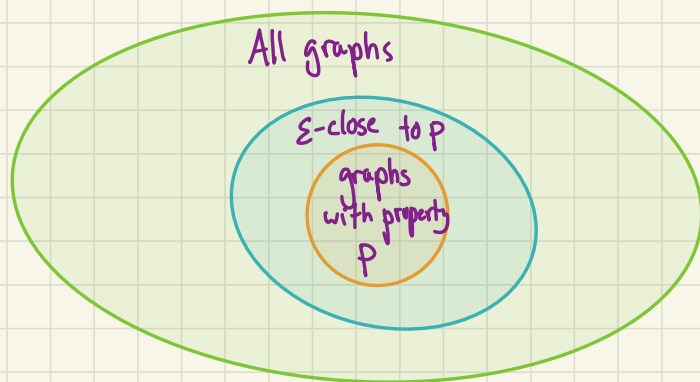
- $E[\text{total edges explored per query}] \leq \sum_{k=0}^{\infty} \frac{(2\Delta)^k}{(k+1)!}$   
 $\leq \frac{e^{O(\Delta)}}{\Delta}$

- $E[\text{query total complexity (for all queries)}] \leq \Delta \cdot \frac{e^{O(\Delta)}}{\Delta} = e^{O(\Delta)} = 2^{O(\Delta)}$

New topic:

What sort of approximations  
make sense for  
decision problems?

# Property Testing



P is a subset of graphs

Can we distinguish graphs in P from graphs that are not in P? not even  $\epsilon$ -close?

Goal if G has property P, pass  
if G  $\epsilon$ -far from P, fail

(if G is  $\epsilon$ -close, can either pass or fail)

For today: def  $\deg \leq \Delta$  graph G is  $\epsilon$ -close to P if can remove  $\leq \epsilon \Delta n$  edges to turn G into some  $G' \in P$

# Planarity:

def a **Planar** graph can be drawn in plane  
st. edges intersect only at endpoints.

e.g.



planar



not planar

## Cool Thm [Kuratowski]

$G$  is planar iff does not contain

$K_5$  or  $K_{3,3}$  as minor

↑  
complete graph on 5 nodes

↑  
complete bipartite graph with 3 nodes on side

↑  
subgraph repeatedly contract edges into nodes

