

## Lecture 5:

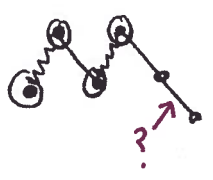
- Using Greedy Algorithms to design Sublinear Time Algorithms - the case of maximal matching
  - Property testing:  
Is the graph Planar?
-

# Sublinear Time Approximation Algorithms via Greedy

## Estimating size of maximal matching in degree bounded graph

Why?

• relation to Vertex Cover



-  $VC \geq MM$  ← for each edge in matching,  $\geq 1$  endpoint must be in VC  
these are disjoint

-  $VC \leq 2MM$  ← put all MM nodes in VC  
if an edge not covered, then violates maximality

• a step towards approx maximum matching

Note: if  $deg \leq d$ , Maximal matching  $\geq \frac{n}{d}$  ← to see this, run greedy algorithm

### Greedy Sequential Matching Algorithm:

$M \leftarrow \emptyset$

$\forall e = (u, v) \in E,$   
if neither  $u$  or  $v$  matched,  
add  $e$  to  $M$

output depends only on ordering of input edges

Output  $M$

Observe:

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

## Oracle reduction Framework

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

•  $S \leftarrow S = \frac{\gamma}{\epsilon^2}$  nodes chosen iid.

•  $\forall v \in S$   

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

• 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 an underestimate unlikely

Behavior of output: Why does it work?

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

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

$$= \frac{n}{2s} \sum_{v \in S} E[X_v] + \frac{\epsilon}{2} \cdot n \quad \leftarrow \text{but } E[X_v] = \frac{2|M|}{|V|} = \frac{2|M|}{n}$$

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

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

"

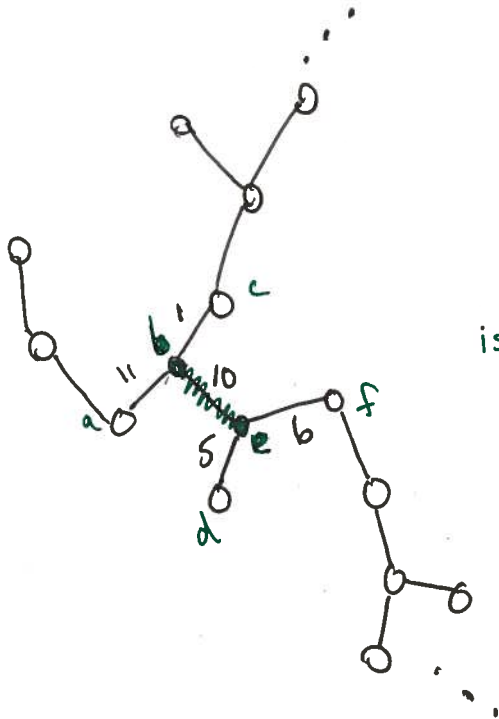
$$\Pr\left[\left|\frac{n}{2s} \sum_{v \in S} X_v - |M|\right| \geq \frac{\epsilon}{2} n\right] \leq \frac{1}{3} \quad \text{by additive Chernoff-Hoeffding}$$

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

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 previous nodes?



is  $(b,e) \in M$ ?

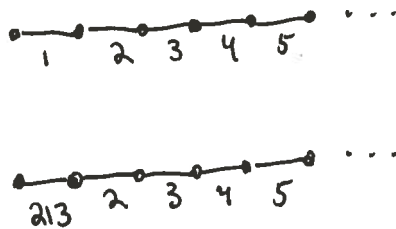
adjacent to:

$(b,c)$   $(e,d)$   $(e,f)$   $(a,b)$   
 1            5            6            11

Greedy considers 1st + puts  $(b,c)$  into  $M$   
 so  $(b,e) \notin M!$   
 no need to consider rest of graph

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

example:



~~212~~  
~~212~~

even if you know graph is a line, is edge odd or even in order?

Implementing oracle based on greedy:

Algorithm:

Given  $e$ , is  $e$  in  $M$ ?

- recursively find out all decisions

for adjacent edges with lower order number

(do not need any info on adjacent edges

with higher order number, since not

considered by greedy before  $e$ )

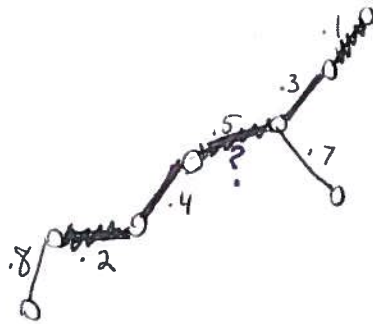
- if any adjacent edge before  $e$  in ordering is matched,  $e$  is not matched

else  $e$  is matched.

How to break length of dependency chains?

assign random ordering to edges

example



is edge 5 in  $M$ ?

- recurse on .3

- recurse on .1

- no other adjacent edges ~~to~~

- .1 is matched

- therefore .3 is not matched

- no need to recurse on .7 since  $.5 < .7$

- don't know yet about .5. so recurse on .4

- recurse on .2

- .8 comes after .2 in order so doesn't affect Greedy's behavior

- same for .4

- so .2 is matched

- .4 is not matched

- .5 is matched

Implementation of oracle: assume ranks  $r_e$  assign 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 than  $e$   
is in  $M$

Correctness: follows from correctness of greedy

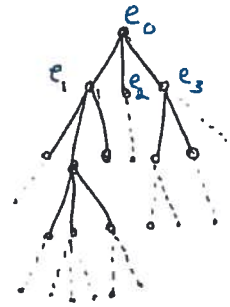
Query complexity:

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

Claim  $\Rightarrow$  total query complexity is  $\frac{2^{O(d)}}{\epsilon^2}$   
+ Parnas-Ron

Pf of Claim

- Consider ~~Query Tree~~ where root node labelled by original query edge, children of each node are edges adjacent to it.

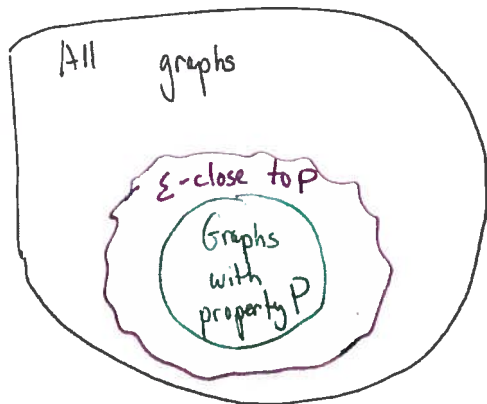


- will only query paths that are monotone decreasing in rank
- $\Pr[\text{given path of length } k \text{ explored}] = \frac{1}{(k+1)!}$
- $\# \text{ edges in original graph at dist } \leq k \text{ in tree} \leq d^k$
- $E[\# \text{ edges explored at dist } \leq k] \leq \frac{d^k}{(k+1)!}$
- $E[\text{total } \# \text{ edges explored}] \leq \sum_{k=0}^{\infty} \frac{d^k}{(k+1)!} \leq \frac{e^d}{d}$

■

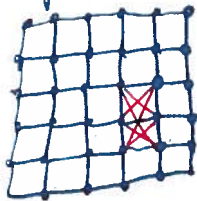


# Property Testing



Can we distinguish? in sublinear time?

e.g.  $P = \text{"planar"}$



## Compromise

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

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

Today: Test planarity in time independent of  $n$   
(but exponential in  $\epsilon$ )

Testing H-minor freeness

all graphs have max degree  $\leq d$

def. • H is "minor" of G

if can obtain H from G via  
vertex removals, edge removals, edge contractions



• G is "H-minor-free" if H not minor of G

• G is " $\epsilon$ -close to H-minor-free" if

can remove  $\leq \epsilon dn$  edges to make it  
H-minor-free

(o.w. G is " $\epsilon$ -far")

• minor closed property P -

if  $G \in P$  then all minors of G are in P

### Really Cool Theorem [Robertson + Seymour]

Every minor-closed property is expressible  
as a constant  $\#$  of excluded minors.

Some minor-closed properties:  $K_{3,3}$  or  $K_5$   
planar graph,  $\leq n_0$  bounded tree width, ...

Goal: Testing H-minor freeness

Pass H-minor free graphs

Fail if far from H-minor free

more definitions

•  $G$  is " $(\epsilon, k)$ -hyperfinite" if

Can remove  $\leq \epsilon n$  edges

+ remain with connected components of size  $\leq k$

Useful Thm

Given  $H$   $\leftarrow$  constant that depends only on  $H$   
 $\exists C_H$  st.  $\forall 0 < \epsilon < 1$ , every  $H$ -minor free graph of  $\text{deg} \leq d$   
 is  $(\epsilon d, C_H^2 / \epsilon^2)$ -hyperfinite.  
 (i.e. remove  $\leq \epsilon d n$  edges + components of size  $O(1/\epsilon^2)$ )

note

Subgraphs of  $H$ -minor free graphs also  $H$ -minor free

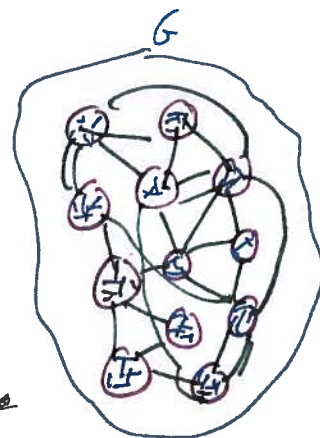
+ so also hyperfinite

but, only remove #edges in proportion to #nodes in subgraph

Why is hyperfiniteness useful?

Partition graph  $G$  into  $G'$

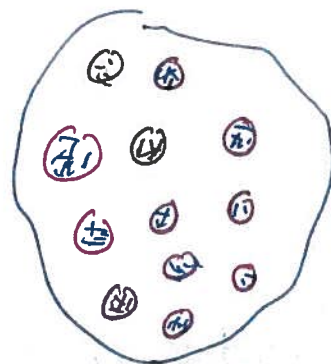
how in sublinear time?  $\left\{ \begin{array}{l} - \text{only const size connected components remain} \\ - \text{removed only few edges } (\leq \epsilon dn) \\ - \text{if can't do this, } G \text{ is not } H\text{-minor free} \end{array} \right.$



If  $G'$  is close to having property, so is  $G$

Constant time  $\left\{ \begin{array}{l} \text{so test } G' \text{ by picking random} \\ \text{components \& seeing if they have the} \\ \text{property} \end{array} \right.$

remove the few green edges  
 $G'$



Need a "local" (sublinear) way to determine  $G'$ . For now assume we have "partition oracle"  $P$

(with parameters  $\frac{\epsilon d}{4}, k$ )  
fraction edges removed  $\uparrow$  component size  $\leftarrow$

input: vertex  $v$

output:  $P[v]$  ( $v$ 's partition name)

s.t.  $\forall v \in V$  (1)  $|P[v]| \leq k$   
(2)  $P[v]$  connected

$\&$  if  $G$  is  $H$ -minor free

with prob  $\geq \frac{9}{10}$   $|\{(u,v) \in E \mid P[u] \neq P[v]\}| \leq \frac{\epsilon dn}{4}$

Easy to test  
since collection  
of constant  
sized graphs!!