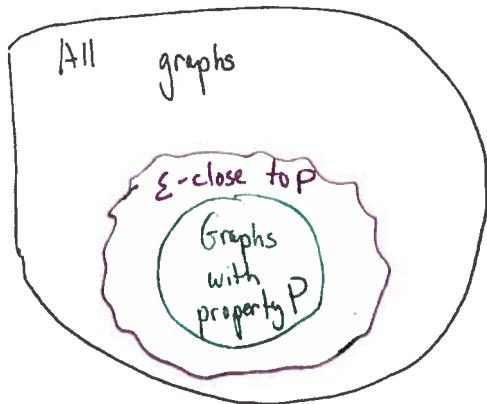


## Lecture 6:

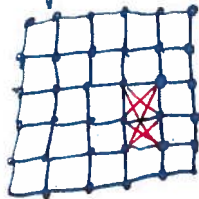
- Testing Planarity + Minor-freeness
- Partition Oracles

# Property Testing



Can we distinguish? in sublinear time?

eg.  $P = \text{"planar"}$



## 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  $\leq k$

(i.e., can remove few edges and break up graph into very small components.)

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.

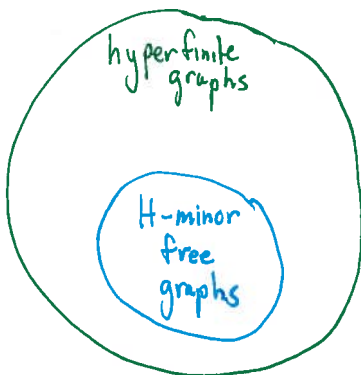
(i.e. remove  $\leq \epsilon d n$  edges + components of size  $O(1/\epsilon^2)$   
 $\leq \epsilon$  fraction independent of  $n$ )

note

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

+ so also hyperfinite

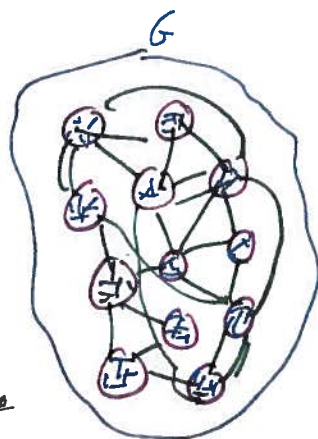
but, only remove #edges in proportion to #nodes in subgraph  
 $\Rightarrow$  Can "recurse" + break up further



Why is hyperfiniteness useful?

Partition graph  $G$  into  $G'$

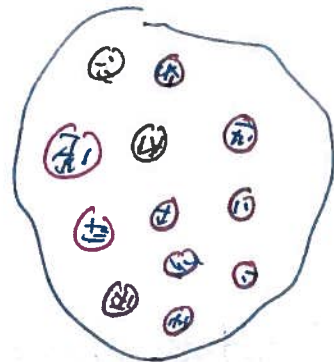
how in sublinear time?   
 { - only const size connected components remain  
 - removed only few edges ( $\leq \epsilon dn$ )  
 - if can't do this,  $G$  is not  $H$ -minor free



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

Constant time { so test  $G'$  by picking random components & seeing if they have the property

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

{ partitions small + connected

+ if  $G$  is  $H$ -minor free

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

{ remove only few edges

Easy to test since collection of constant sized graphs!!

## Algorithm given partition oracle $P$ :

I. Does partition oracle give partition that "looks right"?  
e.g. few crossing edges

$\hat{f} \leftarrow$  estimate of # of edges  $(u,v)$

s.t.  $P[u] \neq P[v]$  to additive error  $\leq \frac{edn}{8}$   
with prob of failure  $\leq \frac{1}{10}$

• if  $\hat{f} > \frac{3}{8} edn$ , output "fail" + halt

II. Test random partitions

• Choose  $S = O(\frac{1}{\epsilon})$  random nodes  $\leftarrow$  these select "random" partitions

• if for any  $s \in S$ ,  $P[s] \geq k$  or  
 $P[s]$  not  $H$ -minor free, reject + halt

size  $k \leq O(\frac{1}{\epsilon^2})$   
so easy to test

• Accept

Runtime:

Part I:  $O(\frac{1}{\epsilon^2})$  calls to oracle

Part II:  $O(\frac{d}{\epsilon^2})$  calls to oracle to determine  $P[s]$

$O(\frac{d}{\epsilon^3})$  total calls

## Analysis (assume oracle $P$ always correct)

- if  $G$  is  $H$ -minor free:

$$1) E[\hat{F}] \leq \frac{\epsilon dn}{4}$$

sampling bounds (Chernoff/Hoeffding)  $\Rightarrow \hat{F} \leq \frac{\epsilon dn}{4} + \frac{\epsilon dn}{8} = \frac{3}{8} \epsilon dn \Rightarrow$  algorithm doesn't fail at stage I with prob  $\geq \frac{9}{10}$

$$2) \forall S \subseteq V, P[S] \text{ is } H\text{-minor free}$$

- if  $G$  is  $\epsilon$ -far from  $H$ -minor free:

Case 1  $P$ 's output doesn't satisfy  $|\{(u,v) \in E : P(u) \neq P(v)\}| \leq \frac{\epsilon dn}{2}$

$$\text{sampling bounds} \Rightarrow \hat{F} \geq \frac{\epsilon dn}{2} - \frac{\epsilon dn}{8} = \frac{3}{8} \epsilon dn$$

$\Rightarrow$  output "fail" with prob  $\geq 9/10$

Case 2  $P$  satisfies  $C \equiv |\{(u,v) \in E : P(u) \neq P(v)\}| < \frac{\epsilon dn}{2}$

$G' \leftarrow G$  with edges in  $C$  removed

Note:  $G'$  is  $\frac{\epsilon}{2}$ -close to  $G$

so, if  $G$  is  $\epsilon$ -far from having property  
then  $G'$  is  $\frac{\epsilon}{2}$ -far from having property!

Since  $G'$  is  $\frac{\epsilon}{2}$ -far from  $H$ -minor free

must change  $\geq \frac{\epsilon n}{2}$  edges, which touch  $\geq \frac{\epsilon n}{2}$  nodes

So, with prob  $\geq \frac{\epsilon}{2}$ , pick node in component  
which is not  $H$ -minor free  $\blacksquare$

Remaining Issue:

Implementing partition oracle  $P$

Plan:

1) Define Global partitioning strategy  
(not sublinear time)

2) Figure out how to implement locally  
(only find partition of given node,  
not whole solution)



A useful concept

"Isolated" Neighborhoods:

def.  $S$  is " $(\delta, k)$ -isolated neighborhood of node  $v$ ":

- if
- 1)  $v \in S$
  - 2)  $S$  connected
  - 3)  $|S| \leq k$
  - 4) # edges connecting  $S + \bar{S} \leq \delta |S|$

In hyperfinite graphs, most nodes have  $(\delta, k)$ -isolated nbhds.

Is this obvious?

- $G$  hyperfinite  $\Rightarrow \exists$  partitioning
- but will need this to be true about remaining graph in context of algorithm that may find a different partition "step-by-step"

- luckily, no matter what was removed earlier, we still have an  $H$ -minor free graph so still hyperfinite!

# Global Partitioning Algorithm $\leftarrow$ a "mental thought process"

Let  $\pi_1 \dots \pi_n$  be nodes in random order

$P \leftarrow \emptyset$

For  $i = 1..n$  do

if  $\pi_i$  still in graph then

if  $\exists (\delta, k)$ -isolated nbhd of  $\pi_i$   
in remaining graph

then  $S \leftarrow$  this nbhd

else  $S \leftarrow \{\pi_i\}$

$P \leftarrow P \cup \{S\}$

Remove  $S +$  adjacent edges from graph

how? need to consider  
all nodes within  
distance  $k$  of  $\pi_i$

use  $\delta = \frac{\epsilon d}{4}$ ,  $k = \frac{1}{\epsilon^2}$

$S$  is just one  
node in this  
case.  
hopefully doesn't happen  
often!

Does this give a partition with few crossing edges?

- $S$  s.t.  $S$  is  $(\delta, k)$ -isolated contribute  $\leq \delta |S|$  edges  
which overall  $\leq \delta \cdot n$

- $S$  s.t.  $S = \{\pi_i\}$  (one node):  
need to show that not too many of these!

Lemma if  $G'$  is subgraph of a (hyperfinite)  
graph  $G$  s.t.  $G'$  has  $\geq \delta n$  nodes

then  $\leq \frac{\epsilon}{30}$  fraction of nodes in  $G'$

don't have  $(\delta, k)$ -isolated nbhds, for  $\delta = \epsilon/30$   
 $k = \Theta(\epsilon^3)$

Pf idea

$G$   $H$ -minor free

$\Downarrow$

$G'$   $H$ -minor free

$\Downarrow$

$G'$  hyperfinite

$\Downarrow$

$\exists$  partition st. most nodes in  $G'$  are in  
 $(k, \delta)$ -isolated nbhd

+

$\pi_i$  randomly chosen in  $G'$

$\Downarrow$

whp  $\pi_i$  in  $(k, \delta)$ -isolated nbhd.



So, not too many "singletons" !!

## Local Simulation of Partitioning Oracle:

- input  $v$
- assume access to random fctn  $\pi(v)$   
 $\pi: V \rightarrow [n]$
- output  $P[v]$

• recursively compute  $P[w]$  for all  $w$  s.t.

- $\pi(w) < \pi(v)$
- $w$  is distance  $\leq 2k$  from  $v$

$d$   
of these  $O(k)$

• if  $\exists w$  s.t.  $v \in P[w]$

then  $P[v] = P[w]$

else look for  $(k, \delta)$ -isolated nbhd of  $v$

(ignoring nodes which are in  $P[w]$  for smaller ranked  $w$ 's)

if find one,  $P[v] \leftarrow$  this nbhd.

else  $P[v] \leftarrow \{v\}$

Query Complexity:  $2^d d^{O(k)}$

using analysis from last time  $+ k \times \Theta(\epsilon^3)$

but can do much better:

currently  $d^{O(\log^2(1/\epsilon))}$  is possible