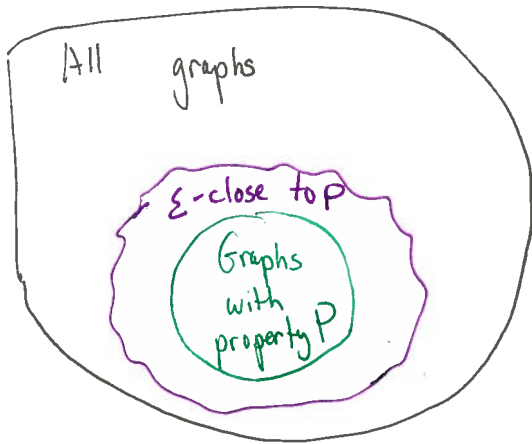


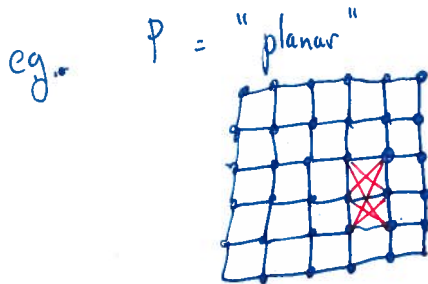
## Today

- Property testing
- testing Planarity (or any minor-free property)
- using partition oracles (also useful for other applications)

# Property Testing



Can we distinguish? in sublinear time?



## 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  $d_{\max}, \epsilon$ )

# 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

• 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, <sup>no</sup> 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  $\leq k$

•  $G$  is " $\rho$ -hyperfinite" if

$\forall \epsilon > 0, G$  is  $(\epsilon, \rho(\epsilon))$ -hyperfinite

} gives #  
conn comp  
in terms of  $\epsilon$

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

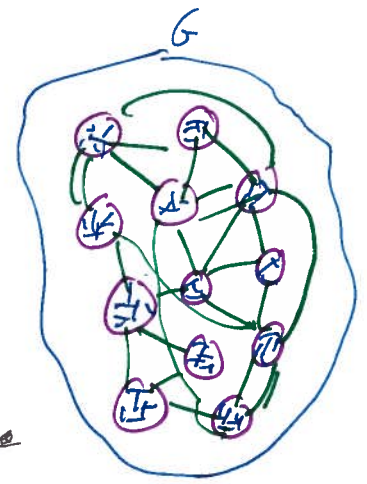
but, only remove #edges in proportion to #nodes in subgraph

Why is hyperfiniteness useful?

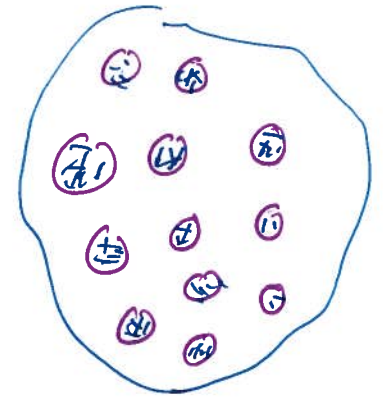
Partition graph  $G$  into  $G'$

how in sublinear time?

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



remove the few green edges  
↓  
 $G'$



Constant time

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

Assume we have "partition oracle"  $P$

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

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

Algorithm given partition oracle  $P$ :

- estimate number  $\hat{f}$  of edges  $(u, v)$   
st.  $P[u] \neq P[v]$  to additive error  $\leq \frac{\epsilon dn}{8}$  with prob failure  $\leq \frac{1}{10}$
- if  $\hat{f} \geq \frac{3}{8} \epsilon dn$ , output "fail" & halt
- else choose  $S' = O(1/\epsilon)$  random nodes  
if for any  $s \in S'$   
 $P[s]$  not  $H$ -minor free, reject & halt
- Accept

Analysis (assume  $P$  always correct)

if  $G$   $H$ -minor free:

$$E[\hat{f}] \leq \frac{\epsilon dn}{4}$$

$$\text{Sampling bounds} \Rightarrow \hat{f} \leq \frac{\epsilon dn}{4} + \frac{\epsilon dn}{8} = \frac{3}{8} \epsilon dn$$

with prob  $\geq 9/10$

$\forall s \in V$ ,  $P[s]$  is  $H$ -minor free

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

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

$$\text{Sampling bnds} \Rightarrow \hat{f} \geq \frac{\epsilon dn}{2} - \frac{\epsilon dn}{8} \geq \frac{3}{8} \epsilon dn$$

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

make mistake only  
if additive estimate  
is off by  $\geq \frac{\epsilon dn}{8}$

Case 2 Pl's output satisfies  $|\{(u, v) \in E : P(u) \neq P(v)\}| \leq \frac{\epsilon dn}{2}$

$G' \leftarrow G$  with "cross" edges removed

$\uparrow$   
 $(u, v)$  st.  $P(u) \neq P(v)$

if  $G'$  is  $\frac{\epsilon}{2}$ -far from having property,  
 third step likely to fail  $\star$  why?

else,  $G'$  is  $\frac{\epsilon}{2}$ -close to property &  $G$  is  $\frac{\epsilon}{2}$ -close to  $G'$ ,

so  $G$  is  $\epsilon$ -close to having property.  $\square$

$\star$  if  $G'$  is  $\frac{\epsilon}{2}$ -far, need to remove at least  $\epsilon dn$  edges,  
 $\epsilon dn$  edges touch at least  $\epsilon n$  nodes. Therefore, with  
 prob  $\geq \epsilon$ , will pick a node in a component  
 which is not minor-free.

So the main remaining issue is

how do we implement the partitioning oracle?

Before implementing, let's consider the following (not sublinear time, just a mental thought process)

Global Partitioning Algorithm

let  $\pi_1, \dots, \pi_n$  be a random labelling of nodes s.t.  $\pi_i \neq \pi_j$   
(random permutation of nodes)  $\forall \pi_i \in [n]$

$P \leftarrow \emptyset$

For  $i=1 \dots n$  do

if  $\pi_i$  still in graph then

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

then  $S \leftarrow$  this nbhd

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

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

Remove  $S$  from graph

def. of  $(k, \delta)$ -isol. nbhd of  $\pi_i$ :

- 1)  $\pi_i \in S$
- 2)  $S$  connected
- 3)  $|S| \leq k$
- 4)  $e(S) \leq \delta |S|$

$\uparrow$   
edges in  $S$

Note  
order of parameters  
got switched  
from here  
onwards

$S$  is just one node, hopefully this doesn't happen often!

For hyperfinite graphs, most nodes have  $(k, \delta)$ -isolated nbhds:

Lemma if  $G'$  subgraph of  $G$  <sup>h.f.</sup> with  $\geq \delta n$  nodes  
 $\leq \frac{\epsilon}{30} |V_{G'}|$  nodes don't have  $(\rho(\frac{\epsilon^2 \delta}{1800}), \frac{\epsilon}{30})$ -isolated nbhd.

pf idea

$G' \subseteq G$  h.f. so  $G'$  can be broken in into components of size  $\leq \rho(\frac{\epsilon^2 \delta}{1800})$   
by removing few edges



Using lemma  $\Rightarrow \leq \frac{\epsilon dn}{8}$  edges cross with prob  $\geq \frac{9}{10}$

### local simulation of oracle:

- assign random number  $\in (0,1)$  to  $v$   
when first see it, use rank orders to define  $\pi$
- to compute  $P[v]$
- recursively compute  $P[w]$   $\forall w$  within distance  $\leq k$  of  $v$   
of rank  $< v$
- if  $\exists w \in P[w]$  then  $P[v] = P[w]$   
else look for  $(k, \delta)$ -isolated nbhd of  $v$   
(ignoring any node which is in  $P[w]$  for any  $w$  with smaller rank)  
if find it,  $P[v] \leftarrow$  this nbhd  
else  $P[v] \leftarrow \{v\}$

### Query complexity:

Can do  
much much  
better !!



•  $d^k$  nodes w/in distance  $k$

•  $2^{d^{O(k)}}$

using [NO] analysis

+  $k \approx \rho(\epsilon^3 / \text{big constant})$