

Last time: continued unit on exity of counting problems:

FP, #P, #P-completeness,  
reductions, examples, permanent.

Papad. 18.1, AB 17.1-17.3

Today: • show that PER of 0/1 matrices is  
in #P. (RSR)

• Random self reducibility:

PER's worst-case hardness  $\Rightarrow$  avg-case hardness.

AB 8.6.2

• approximate counting (maybe)

Questions?

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Consider PER on 0/1 matr.:

0/1 PER: • input is  $n \times n$  mtr of 0/1 entries.

• output = PER(M)

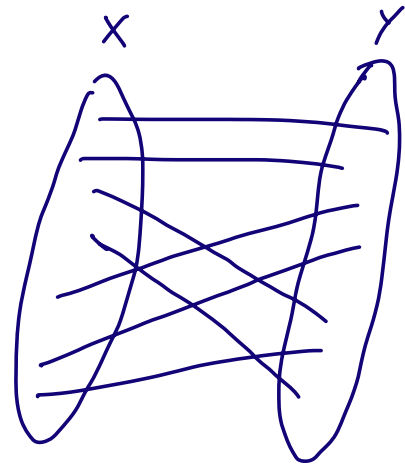
Obs: The problem is  $\equiv$  to #PM

Perfect Matching

Recall a PM in undir. graph  $G$  is a set of  $S$   
edges s.t. each vtx in  $G$  touches exactly

one edge in  $S$ .

If  $G$  bipartite,  
poss. to have PM only if  
 $|X| = |Y|$ .



#PM: input is bip.  $G = (X \cup Y, E)$   
• output is # of PMs in  $G$ .

Pf of **Obs**: Given  $\downarrow$ , construct  
adj. matrix:  $M_{ij} = \begin{cases} 1 & \text{if } \exists X(i) - Y(j) \text{ edge} \\ 0 & \text{if } ? \text{ " " " " " " " .} \end{cases}$

Each monom. in  $PER(M)$  is product of  $n$  0/1  
values: 1 iff all 1; i.e. all the  $n$  cond.  
edges are in  $G$ ; i.e. that monom. is in  $G$ .

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So  $0/1 PER$  is in  $\#P$ .

We didn't  $\sim$  prove  $0/1 PER$  is  $\#P$ -hard,  
but it is (see book...)

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$PER$  nice for many reasons...

one: provable conn. between worst-case + average-case hardness, via random self-reducibility.

Informal riff on WC + hardness:

"worst-case hardness": our usual notion:

any proposed poly-time alg is wrong on some inputs.

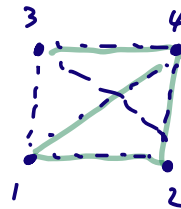
Very possible that a problem is WC hard, yet easy to solve on almost all inputs!

Ex: CUBE-ROOT-CLIQUE =  $\{G:$

$G$  is an  $n$ -node undir. graph that contains a  $n^{1/3}$ -size clique $\}$ . CRC is NPC; worst-case hard... but easy on random  $G$ .

• There are  $\sum \binom{n}{2}$  undir., no self-loop graphs  $G$  on  $n$  nodes.

• Unif. dist. over all these: a "random graph."

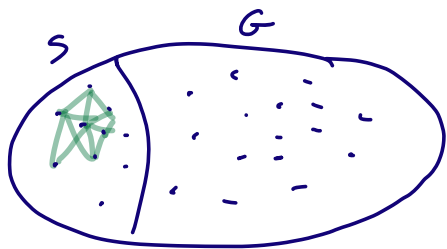


Consider a rand.  $G$ :

Claim:  $\Pr[G \text{ cont. an } n^{1/3}\text{-clique}] \leq \frac{1}{2} \Theta(n^{2/3})$ .

PF: Fix any set  $S \subseteq V$  of size  $|S| = n^{1/3}$ .

$$\Pr[S \text{ is a clique in } G] = \frac{1}{2^{\binom{|S|}{2}}} = \frac{1}{2} \Theta(n^{2/3})$$



There are only  $\binom{n}{n^{1/3}} \leq$

$$n^{n^{1/3}} = 2^{n^{1/3} \cdot \log n} \text{ many poss. for } S.$$

So by union bd,

$\Pr[\text{any set of size } n^{1/3} \text{ is a clique in } G]$

$$\leq 2^{n^{1/3} \cdot \log n} \cdot \frac{1}{2^{\Theta(n^{2/3})}} = \frac{1}{2} \Theta(n^{2/3}) \quad \blacksquare$$

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So CRC is very easy in avg. case: outputting "no" without even reading  $G$ , we have failure prob.

$$\leq \frac{1}{2} \Theta(n^{2/3}).$$

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So, a nat. question is: are there problems that are (presumably) worst-case hard & provably as hard in any case as in worst case?

YES: PER.

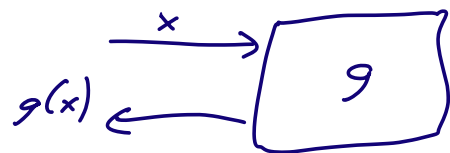
Key idea for RSR. Idea: "f is RSR":

• Suppose you can eff. compute f correctly on random instances (w.h.p.) <sup>over instances</sup> Then you can <sup>using randomness</sup> eff. compute f correctly on any specific x (w.h.p.), i.e. on worst-case instances.

→ Done by combining results of several comput. of f on random instances  $x_1, \dots, x_k$ ; each  $x_i$  rand., but  $x_i$ 's related to each other in a particular way.

Ex: Suppose you have an oracle for a fn

$$g: \{1, 2, \dots, N\} \rightarrow \mathbb{R}.$$



Sps  $g$  is a "noisy linear function"

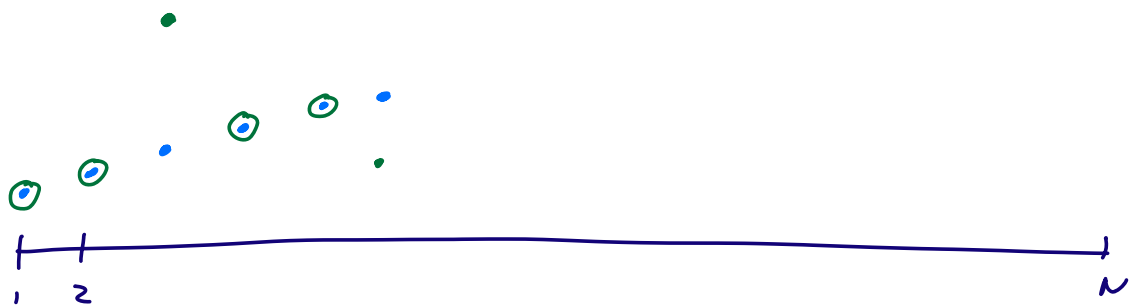
that's 99% consistent with some lin fn  $f(x) = ax + b$ : <sup>unknown</sup>

on  $\frac{99}{100} \cdot N$  input (we don't know which ones),

$$\text{have } g(x) = f(x) = ax + b.$$

$$f(x) = ax + b \quad \forall x$$

$g(x) = f(x)$  99% of the time



Our goal: compute the unknown "true"  $f$  on a partic. fixed input  $z \in \{1, \dots, N\}$ , i.e.  $a \cdot z + b$ .

↳ may have been provided by an adversary...

Not a good idea to just output  $g(z)$ : if  $z$  is a "worst-case" input, <sup>it</sup> could be one of the 1% of error points. (if  $z$  were adversarially chosen).

The fix:

- pick two unif. random pts  $i, j \in \{1, \dots, N\}$ ;

call  $g$  twice to get  $g(i), g(j)$

- Assuming  $g(i) = a \cdot i + b$

$g(j) = a \cdot j + b$ , can solve

to get  $a, b$ ; then  $a \cdot z + b =$  desired answer.

Since  $i, j$  random,

$\Pr[g \text{ wrong on either } i \text{ or } j] \leq \frac{2}{100}$ ,

so this alg. is correct w.p.  $\geq \frac{98}{100}$ , no matter what  $z$  is.

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We did:  $\text{worst-case easy} \Leftarrow \text{avg-case easy}$

Contrapos:  $\text{worst-case hardness} \Rightarrow \text{avg-case hardness}$ .

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What's the magic? Alg. struc. of linear fns.

PER also has algebraic structure; can do something similar.

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Now: PER.

Easier/cleaner to work mod  $p$ : all our math is over  $\mathbb{Z}_p = \{0, 1, \dots, p-1\}, \text{ mod } p$ .

Can  $+, -, \times, \div$  as usual.

MODPER: Input:  $(M, p)$

$M$  is  $n \times n$  matrix over  $\mathbb{Z}_p$ ,  $p$  a prime.

Output:  $\text{PER}(M) \text{ mod } p$ .

Claim: MODPER is #P-hard. (If there is a  $\text{poly}(n)$ -time alg for MODPER, then there's a  $\text{poly}(n)$ -time alg for O/1 PER.)

PF: Let  $M$  be an input to OI/PER, i.e. an  $n \times n$  O/I matrix; want to compute  $PER(M)$ .

Let  $p_1, \dots, p_n$  be first  $n$  primes that are  $> n$ . (Easy to find in  $\text{poly}(n)$  time.)

Run our hyp. MODPER alg on

$$(M, p_1) \rightsquigarrow a_1 \quad (PER(M) \bmod p_1) \equiv a_1$$

$$(M, p_2) \rightsquigarrow a_2$$

$\vdots$

$$(M, p_n) \rightsquigarrow a_n$$

Use Chinese Remainder <sup>CRT</sup>Theorem to combine answers  $a_1, \dots, a_n$  to get  $PER(M) \bmod (p_1 p_2 \dots p_n)$ .

Since  $p_1 p_2 \dots p_n > n^n > n!$ ,  
+  $PER(M) \leq n!$ ,

= to  $PER(M)$ . ■

CRT: Given  $(a, A, b, B)$

where  $0 \leq a \leq A-1$

$0 \leq b \leq B-1$ , +  $A, B$  relatively <sup>prime</sup>,

based on extended Euclidean alg for GCD

there's an eff. alg. <sup>↗</sup> to compute the unique value

$$c \in \{0, 1, \dots, AB-1\} \text{ s.t. } (c \bmod A) \equiv a$$

$$(c \bmod B) \equiv b.$$



Ex: if  $x \in \{0, \dots, 34\}$  +  $(x \bmod 7) \equiv 4,$   
 $(x \bmod 5) \equiv 2,$   
must have  $x = 32.$

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So, MODPER is (presumably) worst-case  
hard; next time: use RSR to show that  
it is as hard in the average case as in the  
worst case!

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