

**CS151
Complexity
Theory**

Lecture 13
May 16, 2023

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Karp-Lipton

- we know that $P = NP$ implies SAT has polynomial-size circuits.
 - (showing SAT does *not* have poly-size circuits is one route to proving $P \neq NP$)
- suppose SAT has poly-size circuits
 - any consequences?
 - might hope: $SAT \in P/poly \Rightarrow PH$ collapses to P , same as if $SAT \in P$

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Karp-Lipton

Theorem (KL): if SAT has poly-size circuits then PH collapses to the **second** level.

- Proof:
 - suffices to show $\Pi_2 \subseteq \Sigma_2$
 - $L \in \Pi_2$ implies L expressible as:

$$L = \{x : \forall y \exists z (x, y, z) \in R\}$$
 with $R \in P$.

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Karp-Lipton

$L = \{x : \forall y \exists z (x, y, z) \in R\}$

- given (x, y) , “ $\exists z (x, y, z) \in R$?” is in **NP**
- pretend C solves SAT, use self-reducibility
- Claim: if $SAT \in P/poly$, then $L =$

$$\{x : \exists C \forall y$$

poly time

$$[use\ C\ repeatedly\ to\ find\ some\ z\ for\ which\ (x, y, z) \in R; \text{ accept iff } (x, y, z) \in R]\}$$

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Karp-Lipton

$L = \{x : \forall y \exists z (x, y, z) \in R\}$

$\{x : \exists C \forall y [use\ C\ repeatedly\ to\ find\ some\ z\ for\ which\ (x,y,z) \in R; \text{ accept iff } (x,y,z) \in R]\}$

- $x \in L$:
 - some C decides $SAT \Rightarrow \exists C \forall y [...]$ accepts
- $x \notin L$:
 - $\exists y \forall z (x, y, z) \notin R \Rightarrow \forall C \exists y [...]$ rejects

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BPP \subseteq PH

- Recall: don't know **BPP** different from **EXP**

Theorem (S,L,GZ): $BPP \subseteq (\Pi_2 \cap \Sigma_2)$

- don't know $\Pi_2 \cap \Sigma_2$ different from **EXP** but believe much weaker

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BPP \subseteq PH

- Proof:
 - BPP language L: p.p.t. TM M:
 - $x \in L \Rightarrow \Pr_y[M(x,y) \text{ accepts}] \geq 2/3$
 - $x \notin L \Rightarrow \Pr_y[M(x,y) \text{ rejects}] \geq 2/3$
 - strong error reduction: p.p.t. TM M'
 - use n random bits ($|y'| = n$)
 - # strings y' for which $M'(x, y')$ incorrect is at most $2^{n/3}$
 - (can't achieve with naïve amplification)

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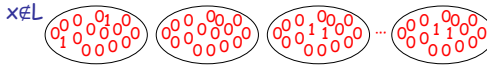
BPP \subseteq PH

- view $y' = (w, z)$, each of length $n/2$
- consider output of $M'(x, (w, z))$:

so few ones, not enough for whole disk

w = 000...00 000...01 000...10 ... 111...11

x ∈ L 

x ∉ L 

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BPP \subseteq PH

- proof (continued):
 - strong error reduction: # bad $y' < 2^{n/3}$
 - $y' = (w, z)$ with $|w| = |z| = n/2$
 - Claim: $L = \{x : \exists w \forall z M'(x, (w, z)) = 1\}$
 - $x \in L$: suppose $\forall w \exists z M'(x, (w, z)) = 0$
 - implies $\geq 2^{n/2}$ 0's; contradiction
 - $x \notin L$: suppose $\exists w \forall z M'(x, (w, z)) = 1$
 - implies $\geq 2^{n/2}$ 1's; contradiction

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BPP \subseteq PH

- given BPP language L: p.p.t. TM M:
 - $x \in L \Rightarrow \Pr_y[M(x,y) \text{ accepts}] \geq 2/3$
 - $x \notin L \Rightarrow \Pr_y[M(x,y) \text{ rejects}] \geq 2/3$
- showed $L = \{x : \exists w \forall z M'(x, (w, z)) = 1\}$
- thus $BPP \subseteq \Sigma_2$
- BPP closed under complement $\Rightarrow BPP \subseteq \Pi_2$
- conclude: $BPP \subseteq (\Pi_2 \cap \Sigma_2)$

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New Topic

The complexity of counting

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Counting problems

- So far, we have ignored function problems
 - given x , compute $f(x)$
- important class of function problems:
 - counting problems
- e.g. given 3-CNF ϕ how many satisfying assignments are there?

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Counting problems

- **#P** is the class of function problems expressible as:

input x $f(x) = |\{y : (x, y) \in R\}|$
 where $R \in \mathbf{P}$.

- compare to **NP** (decision problem)

input x $f(x) = \exists y : (x, y) \in R ?$
 where $R \in \mathbf{P}$.

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Counting problems

- examples

– **#SAT**: given 3-CNF ϕ how many satisfying assignments are there?

– **#CLIQUE**: given (G, k) how many cliques of size at least k are there?

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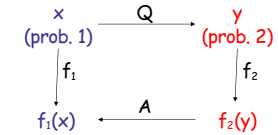
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Reductions

- Reduction from function problem f_1 to function problem f_2

– two efficiently computable functions Q, A



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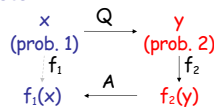
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Reductions

- problem f is **#P-complete** if

– f is in **#P**

– every problem in **#P** reduces to f



- “**parsimonious reduction**”: A is identity

– many standard **NP-completeness** reductions are parsimonious

– therefore: if **#SAT** is **#P-complete** we get lots of **#P-complete** problems

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#SAT

#SAT: given 3-CNF ϕ how many satisfying assignments are there?

Theorem: **#SAT** is **#P-complete**.

- Proof:

– clearly in **#P**: $(\phi, A) \in R \Leftrightarrow A$ satisfies ϕ

– take any $f \in \mathbf{#P}$ defined by $R \in \mathbf{P}$

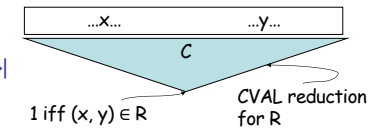
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#SAT

$f(x) = |\{y : (x, y) \in R\}|$



1 iff $(x, y) \in R$

CVAL reduction for R

– add new variables z , produce ϕ such that

$\exists z \phi(x, y, z) = 1 \Leftrightarrow C(x, y) = 1$

– for (x, y) such that $C(x, y) = 1$ this z is **unique**

– hardwire x

– # satisfying assignments = $|\{y : (x, y) \in R\}|$

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Relationship to other classes

- To compare to classes of **decision problems**, usually consider $P^{\#P}$ which is a decision class...
- easy: $NP, coNP \subseteq P^{\#P}$
- easy: $P^{\#P} \subseteq PSPACE$

Toda's Theorem (homework): $PH \subseteq P^{\#P}$.

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Relationship to other classes

Question: is $\#P$ hard because it entails **finding NP** witnesses?

...or is **counting** difficult by itself?

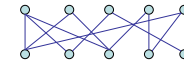
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Bipartite Matchings

- Definition:
 - $G = (U, V, E)$ bipartite graph with $|U| = |V|$
 - a **perfect matching** in G is a subset $M \subseteq E$ that touches every node, and no two edges in M share an endpoint



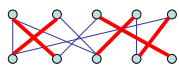
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Bipartite Matchings

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Bipartite Matchings

- $\#MATCHING$: given a bipartite graph $G = (U, V, E)$ how many perfect matchings does it have?

Theorem: $\#MATCHING$ is $\#P$ -complete.

- But... can **find** a perfect matching in polynomial time!
 - counting itself must be difficult

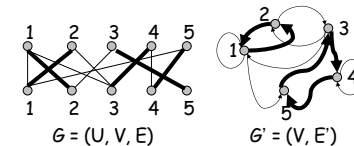
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Cycle Covers

- Claim:** 1-1 correspondence between **cycle covers in G'** and **perfect matchings in G**
 - $\#MATCHING$ and $\#CYCLE-COVER$ parsimoniously reducible to each other



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Cycle Covers

- **cycle cover**: collection of node-disjoint directed cycles that touch every node
- **#CYCLE-COVER**: given directed graph $G = (V, E)$ how many cycle covers does it have?

Theorem: #CYCLE-COVER is #P-complete.
 – implies #MATCHING is #P-complete

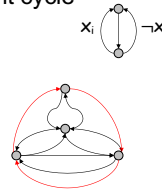
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Cycle Cover is #P-complete

- **variable gadget**: every cycle cover includes left cycle or right cycle
- **clause gadget**: cycle cover cannot use all three outer edges
 – and each of 7 ways to exclude at least one gives exactly 1 cover using those external edges

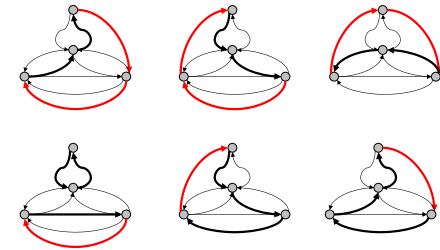


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Cycle Cover is #P-complete

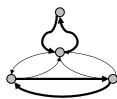


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Cycle Cover is #P-complete



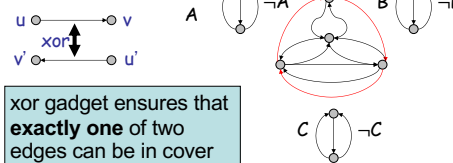
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Cycle Cover is #P-complete

- clause gadget corresponding to $(A \vee B \vee C)$ has “xor” gadget between outer 3 edges and A, B, C



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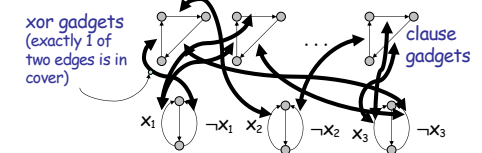
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Cycle Cover is #P-complete

- Proof outline (reduce from #SAT)

$$(\neg x_1 \vee x_2 \vee \neg x_3) \wedge (\neg x_3 \vee x_1) \wedge \dots \wedge (x_3 \vee \neg x_2)$$



N.B. must avoid reducing SAT to MATCHING!

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Cycle Cover is #P-complete

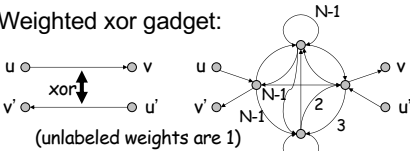
- Introduce edge weights
 - cycle cover weight is product of weights of its edges
- “implement” xor gadget by
 - weight of cycle cover that “obeys” xor multiplied by $4 \pmod N$
 - weight of cycle cover that “violates” xor multiplied by N

large integer

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Cycle Cover is #P-complete

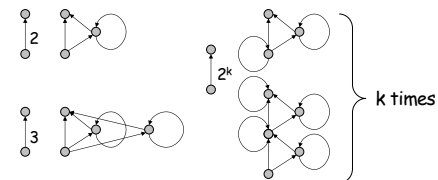
- Weighted xor gadget:
 
 - weight of cycle cover that “obeys” xor multiplied by $4 \pmod N$
 - weight of cycle cover that “violates” xor multiplied by N

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Cycle Cover is #P-complete

- Simulating positive edge weights
 - need to handle 2, 3, 4, 5, ..., N-1

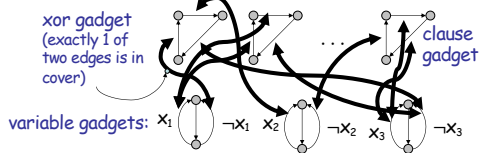


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Cycle Cover is #P-complete

$$(\neg x_1 \vee x_2 \vee \neg x_3) \wedge (\neg x_3 \vee x_1) \wedge \dots \wedge (x_3 \vee \neg x_2)$$



- $m = \# \text{ xor gadgets}$; $n = \# \text{ variables}$; $N > 4^m 2^n$
- $\# \text{ covers (mod } N) = (4^m) \cdot (\# \text{ sat. assignments})$

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New Topic

- proof systems
- interactive proofs and their power
- Arthur-Merlin games

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Proof systems

$$L = \{ (A, 1^k) : A \text{ is a true mathematical assertion with a proof of length } k \}$$

What is a “proof”?

complexity insight: meaningless unless can be **efficiently** verified

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Proof systems

- given language L , goal is to prove $x \in L$
- **proof system** for L is a verification algorithm V
 - **completeness**: $x \in L \Rightarrow \exists \text{ proof}, V \text{ accepts } (x, \text{proof})$
“true assertions have proofs”
 - **soundness**: $x \notin L \Rightarrow \forall \text{ proof}^*, V \text{ rejects } (x, \text{proof}^*)$
“false assertions have no proofs”
 - **efficiency**: $\forall x, \text{proof}: V(x, \text{proof})$ runs in polynomial time in $|x|$

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Classical Proofs

- previous definition:
“classical” proof system
- recall:
 $L \in \text{NP}$ iff expressible as
 $L = \{x \mid \exists y, |y| < |x|^k, (x, y) \in R\}$ and $R \in \text{P}$.
- **NP** is the set of languages with classical proof systems (R is the verifier)

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Interactive Proofs

- Two new ingredients:
 - **randomness**: verifier tosses coins, errs with some small probability
 - **interaction**: rather than “reading” proof, verifier **interacts** with computationally unbounded **prover**
- **NP** proof systems lie in this framework: prover sends proof, verifier does not use randomness

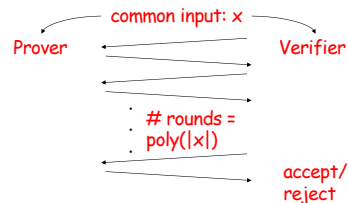
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Interactive Proofs

- **interactive proof system** for L is an interactive protocol (P, V)



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Interactive Proofs

- **interactive proof system** for L is an interactive protocol (P, V)
 - **completeness**: $x \in L \Rightarrow \Pr[V \text{ accepts in } (P, V)(x)] \geq 2/3$
 - **soundness**: $x \notin L \Rightarrow \forall P^* \Pr[V \text{ accepts in } (P^*, V)(x)] \leq 1/3$
 - **efficiency**: V is p.p.t. machine
- **repetition**: can reduce error to any ϵ

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Interactive Proofs

IP = $\{L : L \text{ has an interactive proof system}\}$

- Observations/questions:
 - philosophically interesting: captures more broadly what it means to be convinced a statement is true
 - clearly $\text{NP} \subseteq \text{IP}$. Potentially larger. How much larger?
 - if larger, randomness is essential (why?)

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