

# CS221 (Computational Complexity)

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## TODAY

- ① Administrative Things
- ② Outline of Course
- ③ Review of CS121 (what we need)



## Contacts

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## To Do List

- Sign up on Piazza
- Enroll in Course!
- Sign up for scribing
- look at PS1 (due Friday)

<http://madhu.seas.harvard.edu/courses/spring2018>

# Grading

(2)

- ① 3-5 problem sets (40%)
- ② SCRIBE WORK (30%)
- ③ 1 PROJECT (15%)
- ④ ∞ PARTICIPATION (15%)

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## Goals Of Computational Complexity

- Identify important problems  
(+ related phenomena / classes)
- Analyze resources needed & compare tradeoffs.
- Compare with other problems.



What makes a problem interesting?

(3)

Example 0: 3SAT

Input: 3CNF formula

$$\phi = (\bar{X}_n = (x_1 \dots x_n); \bar{C} = (C_1 \dots C_m))$$

*variables*                      *clauses*

$$C_j = (x_{i_1} \vee \neg x_{i_2} \vee x_{i_3})$$

*literals*

↑                      ↑  
OR                      NEGATION

Problem: Decide if  $\exists$  satisfying Assignment

i.e., Assignment  $x_1=0, x_2=0, x_3=1 \dots$

s.t.  $\forall j$  some literal is 1

~~Example 0~~

Example 1: #SAT

Input: 3CNF formula  $\phi$

Problem: Output # satisfying assignments to  $\phi$ .

## Example 2: Permanent

(4)

Given:  $n \times n$  matrix  $A = \begin{bmatrix} a_{ij} \end{bmatrix}$

Output:

$$\text{perm}(A) \cong \sum_{\pi: [n] \rightarrow [n]} \prod_{i=1}^n a_{i\pi(i)}$$

$$\pi: [n] \rightarrow [n]$$

↑  
1-1 function (permutation)

for contrast:  $\det(A) = \sum_{\pi: [n] \rightarrow [n]} (-1)^{\text{sign}(\pi)} \prod_{i=1}^n a_{i\pi(i)}$

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## CNF Minimization

Given: 3 CNF formula  $\phi$

Output: Equivalent formula  $\psi$   $\left[ \begin{array}{l} \text{is } \phi(x) = \psi(x) \\ \forall x \end{array} \right]$

with min. # clauses.

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VC Dimension (Defn. Omitted)



What makes a problem interesting

(a) Natural ("Subjective")

AND (b) Captures other interesting problems ("Objective")

0. SAT : Captured many interesting problems ...

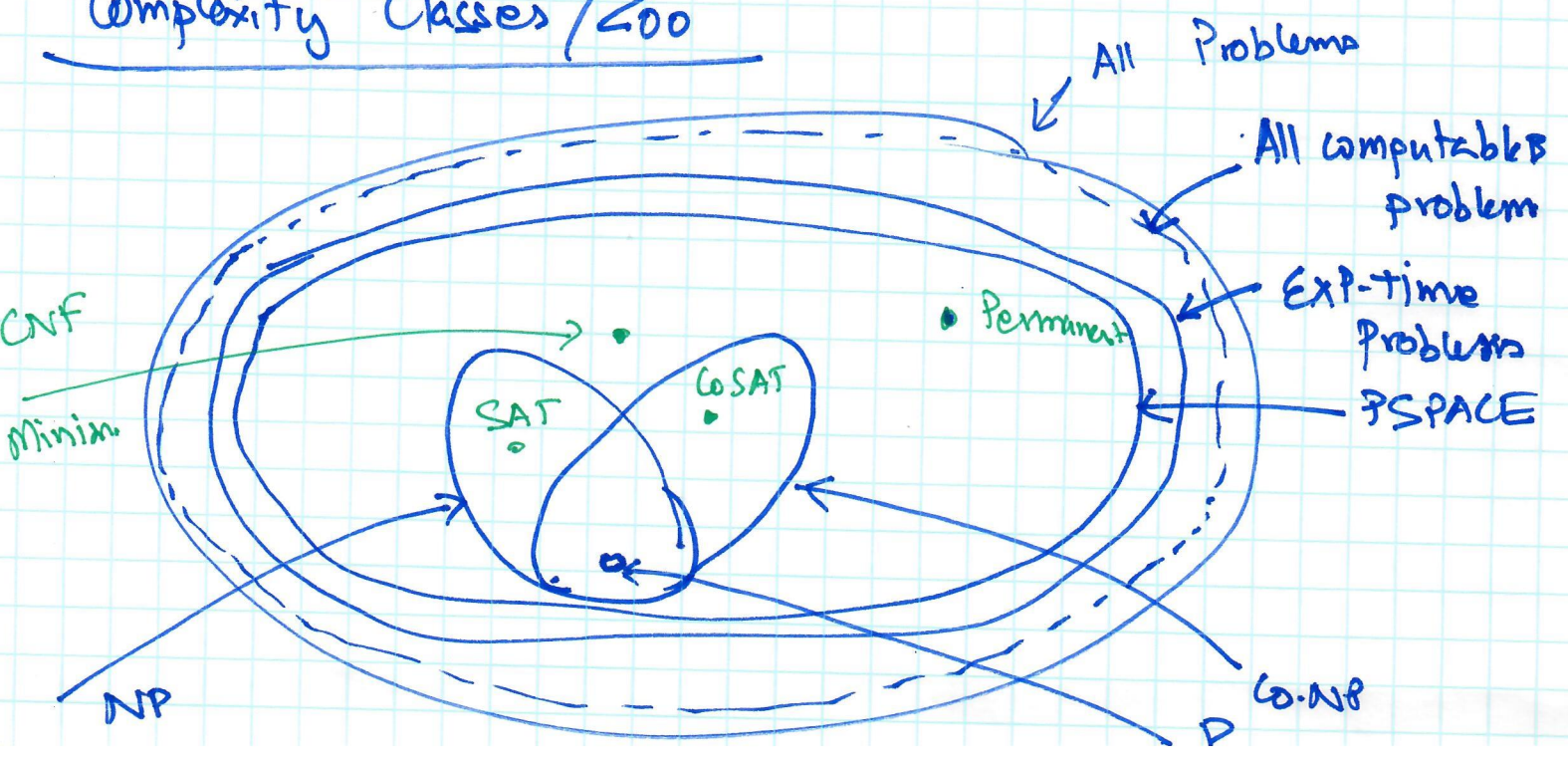
1. #SAT : "Pr [Event]"

2. Permanent : • Till 1900s : Curious relative of determinant.

• Valiant 80 : Permanent  $\equiv$  #SAT.

• Toda 86 : CNF Minim.  $\leq$  #SAT.

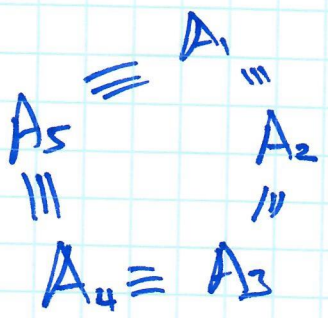
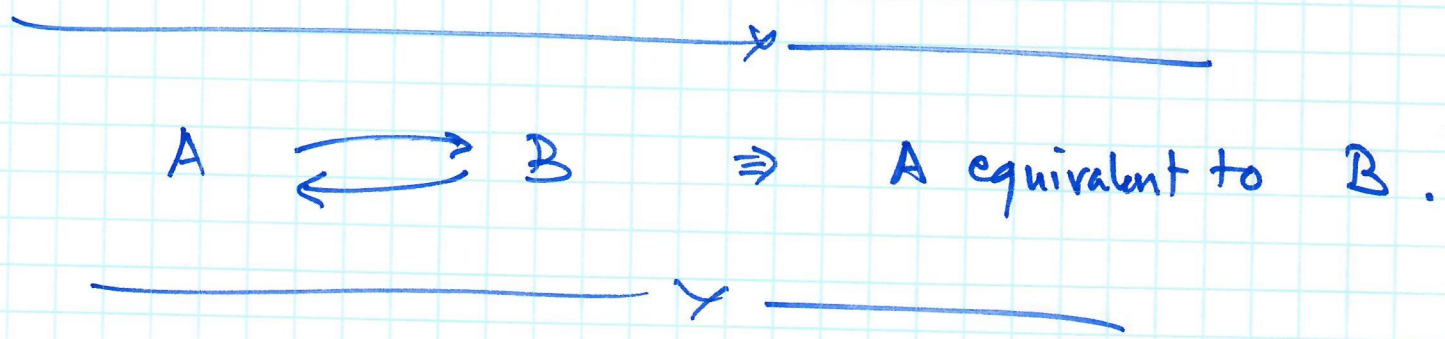
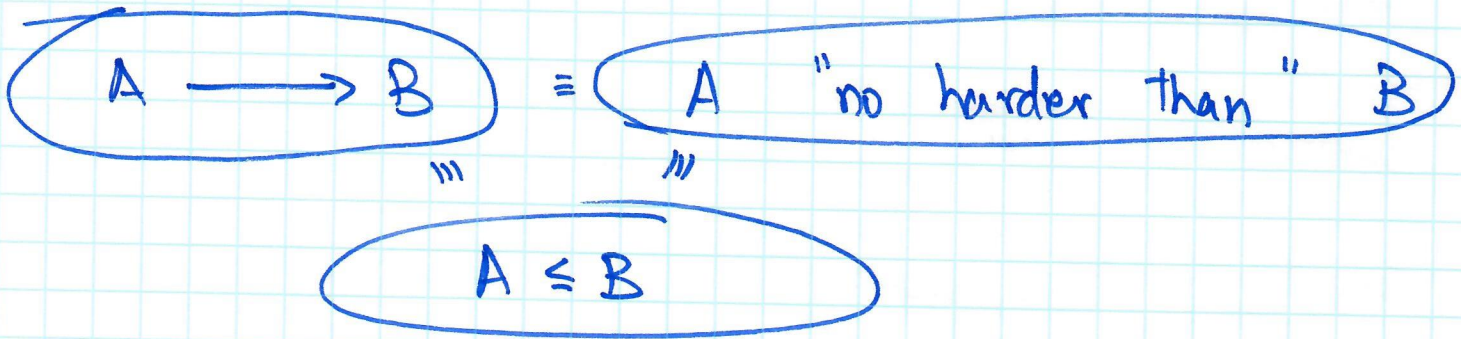
Complexity Classes / Zoo





• Goal of field: Separate problems based on resources

- State of field:
  - Many conjectures.
  - Hard to prove lower bounds
  - Are able to compare quite well.



When we find many equivalent problems: time to define a complexity class!

# Basic Tools for comparisons

① Languages  $\equiv$  Decision Problems  $\equiv$  Boolean functions.

[Convert all problems into Decision Problems].  
[YES/NO answer]

② Reduces Problems to one-another.

②.1 Many-many reduction / Turing Reduction

②.2 Many-one reduction / Karp Reduction

$L_1 \leq_m L_2$  if subroutine for  $L_2$  yields algorithm for  $L_1$

$L_1 \leq_{Karp} L_2$  if  $\exists$  algorithm  $A$  s.t.

$$x \in L_1 \iff A(x) \in L_2.$$



Reduction more restricted  $\Rightarrow$  More refined view of computation.



## Example

⑧

~~NP = all languages s.t.~~

SAT: already defined =  $\{ \phi \mid \exists \text{ sat. assignment to } \phi \}$

$\omega$ SAT: =  $\{ \phi \mid \text{No sat. assignment exists for } \phi \}$ .

is  $\text{SAT} \equiv \omega\text{-SAT}$  ?

Answer 1: YES. <sup>Polytime</sup> Alg for SAT can be complemented to get Alg. for  $\omega$ SAT

Answer 2: NO: Easy to "prove"  $\phi \in \text{SAT}$ .

Not known to "prove"

$\phi \in \omega\text{SAT}$ .

————— x —————



# Course Overview

## - Review of Complexity

- { Diagonalization
- { Non-determinism
- { Non-uniformity
- { Space

## - Semi-Classical

Alternation ("Complexity of Debates")

## - Modern

- Randomness

- Interaction

- ↳  $AC^0$  lower bounds
- ↳ Toda's Theorem
- ↳  $IP = PSPACE$

## - Post-Modern

- ↳ PCPs
- ↳ ETH
- ↳ PPA
- ↳ TIA ...

Next Lecture

- Diagonalization : "I can't be saying this"
- Time + Space Hierarchies : More  $\Rightarrow$  More.
- limits of Diagonalization : Relativization .