

# 15-251

Some ~~Great~~ Theoretical Ideas  
in Computer Science  
for

## Complexity Theory: The P vs NP question

Lecture 27 (April 27, 2010)



## The \$1M Questions

The Clay Mathematics Institute  
Millennium Prize Problems

1. Birch and Swinnerton-Dyer Conjecture
2. Hodge Conjecture
3. Navier-Stokes Equations
4. P vs NP
5. Poincaré Conjecture ← solved!
6. Riemann Hypothesis
7. Yang-Mills Theory

## The P versus NP problem

Is perhaps the biggest open problem  
in computer science (and mathematics!) today.

(Even featured in the TV show NUMB3RS)

But what is the P-NP problem?

## Sudoku

|   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|
| 2 |   |   | 3 |   | 8 |   | 5 |   |
|   |   | 3 |   | 4 | 5 | 9 | 8 |   |
|   |   | 8 |   |   | 9 | 7 | 3 | 4 |
| 6 |   | 7 |   | 9 |   |   |   |   |
| 9 | 8 |   |   |   |   |   | 1 | 7 |
|   |   |   |   | 5 |   | 6 |   | 9 |
| 3 | 1 | 9 | 7 |   |   | 2 |   |   |
|   | 4 | 6 | 5 | 2 |   | 8 |   |   |
|   | 2 |   | 9 |   | 3 |   |   | 1 |

3 x 3 x 3

## Sudoku

|   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|
| 2 | 9 | 4 | 3 | 7 | 8 | 1 | 5 | 6 |
| 1 | 7 | 3 | 6 | 4 | 5 | 9 | 8 | 2 |
| 5 | 6 | 8 | 2 | 1 | 9 | 7 | 3 | 4 |
| 6 | 5 | 7 | 1 | 9 | 2 | 3 | 4 | 8 |
| 9 | 8 | 2 | 4 | 3 | 6 | 5 | 1 | 7 |
| 4 | 3 | 1 | 8 | 5 | 7 | 6 | 2 | 9 |
| 3 | 1 | 9 | 7 | 8 | 4 | 2 | 6 | 5 |
| 7 | 4 | 6 | 5 | 2 | 1 | 8 | 9 | 3 |
| 8 | 2 | 5 | 9 | 6 | 3 | 4 | 7 | 1 |

3 x 3 x 3

## Sudoku

|   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|
| F | 2 |   |   | 6 |   | C | B | 3 |
| C |   |   | 4 | 8 | E |   |   | D |
| D | A | 8 |   | 3 | 2 | 7 | F |   |
| 6 |   | E | D | F | C |   | 8 |   |
| 9 | 3 |   | 7 |   |   | A |   |   |
| E |   |   |   | 6 | F | 5 | 8 | 4 |
| C | 8 | 1 | 3 | 9 | D | 0 | 2 | E |
| D | 6 |   | 5 | E | B | 1 |   |   |
| 9 | 6 |   |   | 1 | F | 3 | 2 | 0 |
|   |   | 4 |   | A | 8 | D | 0 | 9 |
| 2 | A |   | 0 | D | 5 | 6 | C |   |
| 5 |   |   | 2 |   |   | A |   | 4 |
| B |   |   |   | 4 |   | 1 | A | 2 |
| 0 | 7 |   | F | 3 | C | D |   | 2 |
|   | 5 | 1 |   | A | 9 | 0 | B |   |
| 2 | D | A |   | 9 |   |   | 1 | 4 |

4 x 4 x 4

## Sudoku

|   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| 0 | F | 9 | 2 | A | 7 | 5 | 1 | 4 | 6 | E | D | C | B | 3 | 8 |
| 7 | C | 1 | 0 | 6 | 4 | 8 | E | A | 8 | 5 | 0 | 2 | D | F | 9 |
| D | A | 8 | 4 | 9 | 3 | B | 2 | 7 | F | C | 1 | 6 | 0 | 5 | E |
| 6 | 5 | B | E | D | F | 0 | C | 2 | 8 | 9 | 3 | 4 | A | 1 | 7 |
| 4 | 9 | 3 | 5 | 7 | 1 | C | D | D | A | F | B | 8 | E | 6 | 2 |
| E | B | 7 | 0 | 2 | A | 6 | F | 5 | 9 | 8 | 4 | D | 3 | C | 1 |
| C | 8 | F | 1 | 3 | 9 | D | 4 | 0 | 2 | 6 | E | 5 | 7 | B | A |
| A | D | 2 | 6 | 8 | 5 | E | B | 3 | 1 | 7 | C | 9 | F | 0 | 4 |
| 9 | 6 | 4 | 8 | E | B | 1 | 7 | F | 3 | 2 | 5 | 0 | C | A | D |
| 3 | 7 | C | F | 4 | 6 | A | 8 | E | D | 0 | 9 | B | 1 | 2 | 5 |
| 2 | 1 | A | B | 0 | D | 3 | 5 | 6 | C | 4 | 8 | 7 | 9 | E | F |
| 5 | E | 0 | D | F | C | 2 | 9 | B | 7 | 1 | A | 3 | 4 | 8 | 6 |
| B | 3 | 6 | 3 | C | E | 4 | D | 1 | 5 | A | 2 | F | 8 | 7 | 0 |
| 1 | 0 | E | 7 | 5 | 8 | F | 3 | C | 4 | D | 6 | A | 2 | 9 | B |
| 8 | 4 | 5 | C | 1 | 2 | 7 | A | 9 | 0 | B | F | E | 6 | D | 3 |
| F | 2 | D | A | B | 0 | 9 | 6 | 8 | E | 3 | 7 | 1 | 5 | 4 | C |

4 x 4 x 4

## Sudoku

|   |   |   |   |
|---|---|---|---|
| 2 | 3 | 8 | 5 |
| 3 | 4 | 5 | 9 |
| 8 | 7 | 9 | 3 |
| 3 | 1 | 9 | 7 |
| 4 | 6 | 5 | 2 |
| 2 | 9 | 3 | 1 |

Suppose it takes you  $S(n)$  to solve  $n \times n \times n$

$V(n)$  time to verify the solution

Fact:  $V(n) = O(n^2 \times n^2)$

Question: is there some constant  $c$  such that  $S(n) \leq n^c$  ?

|   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| 0 | F | 9 | 2 | A | 7 | 5 | 1 | 4 | 6 | E | D | C | B | 3 | 8 |
| 7 | C | 1 | 0 | 6 | 4 | 8 | E | A | 8 | 5 | 0 | 2 | D | F | 9 |
| D | A | 8 | 4 | 9 | 3 | B | 2 | 7 | F | C | 1 | 6 | 0 | 5 | E |
| 6 | 5 | B | E | D | F | 0 | C | 2 | 8 | 9 | 3 | 4 | A | 1 | 7 |
| 4 | 9 | 3 | 5 | 7 | 1 | C | D | D | A | F | B | 8 | E | 6 | 2 |
| E | B | 7 | 0 | 2 | A | 6 | F | 5 | 9 | 8 | 4 | D | 3 | C | 1 |
| C | 8 | F | 1 | 3 | 9 | D | 4 | 0 | 2 | 6 | E | 5 | 7 | B | A |
| A | D | 2 | 6 | 8 | 5 | E | B | 3 | 1 | 7 | C | 9 | F | 0 | 4 |
| 9 | 6 | 4 | 8 | E | B | 1 | 7 | F | 3 | 2 | 5 | 0 | C | A | D |
| 3 | 7 | C | F | 4 | 6 | A | 8 | E | D | 0 | 9 | B | 1 | 2 | 5 |
| 2 | 1 | A | B | 0 | D | 3 | 5 | 6 | C | 4 | 8 | 7 | 9 | E | F |
| 5 | E | 0 | D | F | C | 2 | 9 | B | 7 | 1 | A | 3 | 4 | 8 | 6 |
| B | 3 | 6 | 3 | C | E | 4 | D | 1 | 5 | A | 2 | F | 8 | 7 | 0 |
| 1 | 0 | E | 7 | 5 | 8 | F | 3 | C | 4 | D | 6 | A | 2 | 9 | B |
| 8 | 4 | 5 | C | 1 | 2 | 7 | A | 9 | 0 | B | F | E | 6 | D | 3 |
| F | 2 | D | A | B | 0 | 9 | 6 | 8 | E | 3 | 7 | 1 | 5 | 4 | C |

⋮  
 $n \times n \times n$

## P vs NP problem

=

Does there exist an algorithm for  $n \times n \times n$  Sudoku that runs in time  $p(n)$  for some polynomial  $p()$  ?

|   |   |   |   |
|---|---|---|---|
| 2 | 3 | 8 | 5 |
| 3 | 4 | 5 | 9 |
| 8 | 7 | 9 | 3 |
| 3 | 1 | 9 | 7 |
| 4 | 6 | 5 | 2 |
| 2 | 9 | 3 | 1 |

|   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| 0 | F | 9 | 2 | A | 7 | 5 | 1 | 4 | 6 | E | D | C | B | 3 | 8 |
| 7 | C | 1 | 0 | 6 | 4 | 8 | E | A | 8 | 5 | 0 | 2 | D | F | 9 |
| D | A | 8 | 4 | 9 | 3 | B | 2 | 7 | F | C | 1 | 6 | 0 | 5 | E |
| 6 | 5 | B | E | D | F | 0 | C | 2 | 8 | 9 | 3 | 4 | A | 1 | 7 |
| 4 | 9 | 3 | 5 | 7 | 1 | C | D | D | A | F | B | 8 | E | 6 | 2 |
| E | B | 7 | 0 | 2 | A | 6 | F | 5 | 9 | 8 | 4 | D | 3 | C | 1 |
| C | 8 | F | 1 | 3 | 9 | D | 4 | 0 | 2 | 6 | E | 5 | 7 | B | A |
| A | D | 2 | 6 | 8 | 5 | E | B | 3 | 1 | 7 | C | 9 | F | 0 | 4 |
| 9 | 6 | 4 | 8 | E | B | 1 | 7 | F | 3 | 2 | 5 | 0 | C | A | D |
| 3 | 7 | C | F | 4 | 6 | A | 8 | E | D | 0 | 9 | B | 1 | 2 | 5 |
| 2 | 1 | A | B | 0 | D | 3 | 5 | 6 | C | 4 | 8 | 7 | 9 | E | F |
| 5 | E | 0 | D | F | C | 2 | 9 | B | 7 | 1 | A | 3 | 4 | 8 | 6 |
| B | 3 | 6 | 3 | C | E | 4 | D | 1 | 5 | A | 2 | F | 8 | 7 | 0 |
| 1 | 0 | E | 7 | 5 | 8 | F | 3 | C | 4 | D | 6 | A | 2 | 9 | B |
| 8 | 4 | 5 | C | 1 | 2 | 7 | A | 9 | 0 | B | F | E | 6 | D | 3 |
| F | 2 | D | A | B | 0 | 9 | 6 | 8 | E | 3 | 7 | 1 | 5 | 4 | C |

⋮  
 $n \times n \times n$

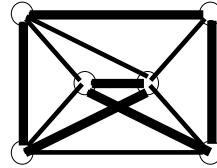
## The P versus NP problem (informally)

Is proving a theorem much more difficult than checking the proof of a theorem?

Let's start at the beginning...

### Hamilton Cycle

Given a graph  $G = (V, E)$ , a cycle that visits all the nodes exactly once



### The Problem "HAM"

Input: Graph  $G = (V, E)$

Output: YES if  $G$  has a Hamilton cycle  
NO if  $G$  has no Hamilton cycle

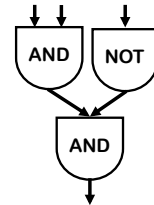
### The Set "HAM"

$HAM = \{ \text{graph } G \mid G \text{ has a Hamilton cycle} \}$

### Circuit-Satisfiability

Input: A circuit  $C$  with one output

Output: YES if  $C$  is satisfiable  
NO if  $C$  is not satisfiable



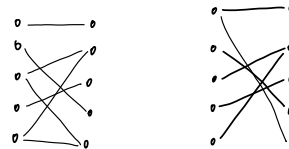
### The Set "SAT"

$SAT = \{ \text{all satisfiable circuits } C \}$

### Bipartite Matching

Input: A bipartite graph  $G = (U, V, E)$

Output: YES if  $G$  has a perfect matching  
NO if  $G$  does not



### The Set “BI-MATCH”

BI-MATCH = { all bipartite graphs that have a perfect matching }

### Sudoku

Input:  $n \times n \times n$  sudoku instance

Output: YES if this sudoku has a solution

NO if it does not

### The Set “SUDOKU”

SUDOKU = { All solvable sudoku instances }

### Decision Versus Search Problems

Decision Problem

YES/NO answers

Does G have a Hamilton cycle?

Can G be 3-colored ?

Search Problem

Find a Hamilton cycle in G if one exists, else return NO

Find a 3-coloring of G if one exists, else return NO

### Reducing Search to Decision

Given an algorithm for decision Sudoku, devise an algorithm to find a solution

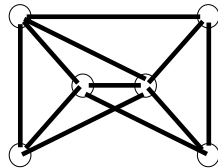
Idea:  
Fill in one-by-one and use decision algorithm

|   |   |   |   |   |   |
|---|---|---|---|---|---|
| 2 |   | 3 | 8 | 5 |   |
|   | 3 | 4 | 5 | 9 | 8 |
|   | 8 |   |   | 9 | 7 |
| 6 | 7 | 9 |   |   |   |
| 9 | 8 |   |   |   | 1 |
|   |   |   | 5 | 6 | 9 |
| 3 | 1 | 9 | 7 |   | 2 |
| 4 | 6 | 5 | 2 | 8 |   |
| 2 |   | 9 | 3 |   | 1 |

### Reducing Search to Decision

Given an algorithm for decision HAM, devise an algorithm to find a solution

Idea:  
Find the edges of the cycle one by one



### Decision/Search Problems

We'll study decision problems because they are almost the same (asymptotically) as their search counterparts

## Polynomial Time and The Class “P” of Decision Problems

### What is an efficient algorithm?

Is an  $O(n)$  algorithm efficient?  
 How about  $O(n \log n)$ ?  
 $O(n^2)$  ?  
 $O(n^{10})$  ?  


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 $O(n^{\log n})$  ?  
 $O(2^n)$  ?  
 $O(n!)$  ?

} polynomial time  
 $O(n^c)$  for some constant  $c$   
 } non-polynomial time

Does an algorithm  
 running in  $O(n^{100})$  time  
 count as efficient?

We consider non-polynomial time  
 algorithms to be inefficient.

And hence a necessary condition for an  
 algorithm to be efficient is that it should  
 run in poly-time.

Asking for a poly-time algorithm for a  
 problem sets a (very) low bar when asking  
 for efficient algorithms.

The question is: can we achieve even this  
 for 3-coloring?  
 SAT?  
 Sudoku?  
 HAM?

### The Class P

We say a set  $L \subseteq \Sigma^*$  is in P if there is  
 a program A and  
 a polynomial  $p(\ )$

such that for any  $x$  in  $\Sigma^*$ ,

A(x) runs for at most  $p(|x|)$  time  
 and answers question “is  $x$  in L?” correctly.

### The Class P

The class of all sets L that can be  
 recognized in polynomial time.

The class of all decision problems that  
 can be decided in polynomial time.

Why are we looking only at sets  $\subseteq \Sigma^*$ ?

What if we want to work with graphs or boolean formulas?

### Languages/Functions in P?

Example 1:

$\text{CONN} = \{\text{graph } G: G \text{ is a connected graph}\}$

Algorithm  $A_1$ :

If  $G$  has  $n$  nodes, then run depth first search from any node, and count number of distinct nodes you see. If you see  $n$  nodes,  $G \in \text{CONN}$ , else not.

Time:  $p_1(|x|) = \Theta(|x|)$ .

### Languages/Functions in P?

HAM, SUDOKU, SAT are not known to be in P

$\text{CO-HAM} = \{G \mid G \text{ does NOT have a Hamilton cycle}\}$

$\text{CO-HAM} \in \text{P}$  if and only if  $\text{HAM} \in \text{P}$

### Onto the new class, NP

### Verifying Membership

Is there a short "proof" I can give you for:

$G \in \text{HAM}?$

$G \in \text{BI-MATCH}?$

$C \in \text{SAT}?$

$G \in \text{CO-HAM}?$

### NP

A set  $L \in \text{NP}$

if there exists an algorithm  $A$  and a polynomial  $p(\ )$

For all  $x \in L$

there exists  $y$  with  
 $|y| \leq p(|x|)$

such that  $A(x, y) = \text{YES}$

in  $p(|x|)$  time

For all  $x' \notin L$

For all  $y'$  with  
 $|y'| \leq p(|x'|)$

we have  $A(x', y') = \text{NO}$

in  $p(|x|)$  time

### Recall the Class P

We say a set  $L \subseteq \Sigma^*$  is in **P** if there is a program  $A$  and a polynomial  $p()$

such that for any  $x$  in  $\Sigma^*$ ,

$\left\{ \begin{array}{l} A(x) \text{ runs for at most } p(|x|) \text{ time} \\ \text{and answers question "is } x \text{ in } L?" \text{ correctly.} \end{array} \right.$

can think of  $A$  as "proving" that  $x$  is in  $L$

### NP

A set  $L \in \text{NP}$

if there exists an algorithm  $A$  and a polynomial  $p()$

For all  $x \in L$

there exists a  $y$  with  $|y| \leq p(|x|)$

such that  $A(x,y) = \text{YES}$

in  $p(|x|)$  time

For all  $x' \notin L$

For all  $y'$  with  $|y'| \leq p(|x'|)$

Such that  $A(x',y') = \text{NO}$

in  $p(|x|)$  time

### Example: $\text{HAM} \in \text{NP}$

Let  $A(x,y)$  be a program that takes two strings  $x$  and  $y$ , and returns YES if the following conditions hold otherwise it returns NO.

- $y$  is a representation of a labeled graph
- $x$  is a representation of a cycle with the same labeled vertices as  $y$
- every edge of the cycle  $x$  is in the graph  $y$

(All of these conditions can be easily checked in linear time)

By our definition, this proves  $\text{HAM} \in \text{NP}$

### The Class NP

The class of sets  $L$  for which there exist "short" proofs of membership  
(of polynomial length)  
that can be "quickly" verified  
(in polynomial time).

Recall:  $A$  doesn't have to find these proofs  $y$ ; it just needs to be able to verify that  $y$  is a "correct" proof.

### $P \subseteq \text{NP}$

For any  $L$  in  $P$ , we can just take  $y$  to be the empty string and satisfy the requirements.

Hence, every language in  $P$  is also in  $\text{NP}$ .

### Languages/Functions in NP?

$G \in \text{HAM?}$  (Yes, already saw)

$G \in \text{BI-MATCH?}$  (is in  $P$ )

$G \in \text{SAT?}$  (Yes. explain it)

$G \in \text{CO-HAM?}$  (not clear)

Proof that something is in  $\text{NP}$  is often trivial.

### Summary: P versus NP

Set L is in P if membership in L can be decided in poly-time.

Set L is in NP if each x in L has a short “proof of membership” that can be verified in poly-time.

Fact:  $P \subseteq NP$

Question: Does  $NP \subseteq P$  ?

### Why Care?

### NP Contains Lots of Problems We Don't Know to be in P

Classroom Scheduling  
Packing objects into bins  
Scheduling jobs on machines  
Finding cheap tours visiting a subset of cities  
Allocating variables to registers  
Finding good packet routings in networks  
Decryption  
...

OK, OK, I care...

But where do I begin  
if I want to reason about  
the P=NP problem?

How can we prove that  
 $NP \subseteq P$ ?

I would have to show that  
every set in NP has a  
polynomial time algorithm...

How do I do that?  
It may take a long time!  
Also, what if I forgot one of  
the sets in NP?

We can describe  
just one problem L in NP,  
such that  
if this problem L is in P,  
then  $NP \subseteq P$ .

It is a problem that can  
capture all other problems  
in NP.

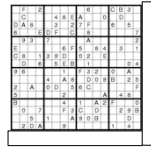
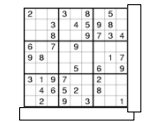
## The “Hardest” Set in NP

## Sudoku

Sudoku has a  
polynomial time  
algorithm

if and only if

$P = NP$



$n \times n \times n$

## The “Hardest” Sets in NP

Sudoku      Clique

SAT                  Independent-Set

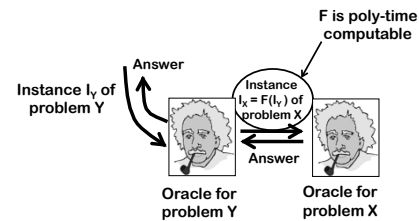
3-Colorability      HAM

These problems are all  
“polynomial-time equivalent”.

I.e., each of these can be reduced to any  
of the others in poly-time

## “Poly-time reducible to each other”

Reducing problem Y to problem X in poly-time



How do you prove these  
are the hardest?

Theorem [Cook/Levin]:

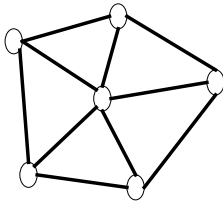
SAT is one language in NP, such that if we  
can show SAT is in P, then we have shown  
 $NP \subseteq P$ .

SAT is a language in NP that can capture all  
other languages in NP.

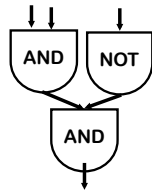
We say SAT is NP-complete.

### Last lecture...

3-colorability



Circuit Satisfiability



### Last lecture...

**SAT and 3COLOR:** Two problems that seem quite different, but are substantially the same.

Also substantially the same as **CLIQUE** and **INDEPENDENT SET**.

If you get a polynomial-time algorithm for one, you get a polynomial-time algorithm for **ALL**.

### Any language in NP

can be reduced  
(in polytime to)  
an instance of

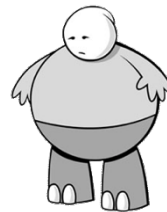
**SAT**

hence SAT is NP-complete

can be reduced  
(in polytime to)  
an instance of

**3COLOR**

hence 3COLOR is NP-complete



### Definition of P and NP

#### Definition of problems

**SAT, 3-COLOR, HAM, SUDOKU, BI-MATCH**

**SAT, 3-COLOR, HAM, SUDOKU** all essentially equivalent.

**Here's What You Need to Know...**

Solve any one in poly-time  
⇒ solve all of them in poly-time