

LECTURE 3Last time:Polynomial-time computation  $\boxed{P}$ 

Efficient computation and Church-Turing thesis

Reductions

- solve problems
- relate hardness of problems

Polynomial-time verifiability  $\boxed{NP}$ 

Nondeterministic Turing machines

Gave examples of problems in NP

Mentioned that some of them are "the hardest":

NP-complete

Let us define what that means

DEF 6  $L \subseteq \{0,1\}^*$  is polynomial-time

L3 II

Karp reducible to  $L' \subseteq \{0,1\}^*$ ,

denoted  $L \leq_p L'$ , if  $\exists$  poly-time

computable function  $f: \{0,1\}^* \rightarrow \{0,1\}^*$

s.t.  $\forall x \quad x \in L \text{ iff } f(x) \in L'$

DEF 7  $L'$  is NP-hard if  $L \leq_p L' \forall L \in NP$

~~NP-hard~~

$L'$  is NP-complete if in addition  $L' \in NP$

$L'$  is as hard as any problem in  $NP$ ,  
since any algorithm efficient for  $L'$   
can be used to decide any language in  $NP$   
efficiently.

LEMMA 8

1. If  $L \leq_p L'$  and  $L' \leq_p L''$  then  $L \leq_p L''$   
(TRANSITIVITY)
2. If  $L$  is NP-hard and  $L \in P$ , then  $P = NP$ .
3. If  $L$  is NP-complete, then  $L \in P$  iff  $P = NP$

Proof See textbook.

So... are there NP-complete problems?

Yes, tons of them. In fact, all over the place  
in math, CS, physics, chemistry, biology,  
economics, industry... [But this course  
focuses on theory not applications.]

The most important (?) ones: Variants of SAT

CNF formula (conjunctive normal form)

Variables  $x, y, z$  set to true = 1 or false = 0

Logical connectives AND  $\wedge$ , OR  $\vee$ , NOT  $\neg$

Except for now negate only variables, written  $\bar{x}$

Literal  $x$  or  $\bar{x}$  True if  $x=1$  or  $x=0$

(Disjunctive) clause  $C = x \vee \bar{y} \vee z$  denoted for  $\varphi$ ,  
satisfied true if one literal true usually

CNF formula & conjunction of clauses

$C_1 \wedge C_2 \wedge \dots \wedge C_m = \bigwedge_{i=1}^m C_i$   
satisfied if all clauses satisfied.

CNFSAT (just SAT in Arora-Barak)

Given CNF formula  $F$ , does it have a satisfying assignment?

Two variants

3-SAT: Each clause has size at most 3

E3-SAT: Each clause has size exactly 3

[Notation varies]

COOK-LEVIN THEOREM ('71 and '73, resp)

1. CNFSAT is NP-complete.
2. 3-SAT is NP-complete.

## L3 IV

Satisfying assignment clearly easy to verify. Need to show every other  $L \in NP$  reduces to CNFSAT.

What can we do?

- Only thing we know is that  $\exists$  TM that verifies witnesses to claim  $x \in L$  and accepts if correct.
- Write computation of such TM on  $x$  as ~~as~~ CNF formula
- Show that can plug in witness so that TM computation is satisfying.

PROP 9 Any Boolean function  $f: \{0,1\}^l \rightarrow \{0,1\}$  can be expressed as a CNF of size  $l \cdot 2^l$

(size = # connectives  $N \vee$  or total # literals)

Look at all assignments  $\alpha$  s.t.  $f(\alpha) = 0$

Suppose  $\alpha = (1, 1, 0, 1)$

Write down clause ruling out this assignment  $C_\alpha = \overline{x_1} \vee \overline{x_2} \vee x_3 \vee \overline{x_4}$

Then  $F = \bigwedge_{\alpha \in f^{-1}(0)} C_\alpha$  represents  $f$ .

(But is of exp size)

Want to construct reduction  $x \rightarrow F_x$  s.t.

$$F_x \in \text{SAT} \iff \exists u \in \{0,1\}^{P(|x|)} \text{ s.t. } M(x,u) = 1$$

Apply Prop 9  $\Rightarrow$  gives formula of size

$$P(|x|) \cdot 2^{P(|x|)}$$

use that TM does local computation

Two simplifying (but justifiable) assumptions:

- (1)  $M$  has two tapes, input and work/output
- (2)  $M$  is oblivious: head movements don't depend on tape contents, only on input length  $|x|$

At most quadratic loss in running time — see AB Ch 1

Can run  $M$  on  $x$  and  $O^{P(|x|)}$  to determine head positions at every time step.

$Q$ : set of states of TM (= lines in program)

$\Gamma$ : alphabet (including  $0, 1, \text{-blank}$  etc.)

$y = x$  and  $a$  concatenated

$$\text{SNAPSHOT } z = \langle a, b, q \rangle \in \Gamma \times \Gamma \times Q$$

$a, b$  symbols read from tapes

$q$  current state

$z$  can be encoded as binary string of fixed length  
say  $c$  bits

Snapshot at time  $i$  depends on

(a) state at time  $i-1$

(b) contents of current locations of tapes.

Suppose we're given sequence of snapshots

$z_1, z_2, z_3, \dots, z_t$  claimed to be correct computation. How to verify?

To check  $z_i$ , only need to look at

(1)  $z_{i-1}$  - did we jump to current state?

(2)  $y_{\text{inputpos}(i)}$  - The input tape head is at position  $\text{inputpos}(i)$ , which we have computed - is the symbol in the snapshot consistent with this

(3)  $z_{\text{prev}(i)}$  -  $\text{prev}(i)$  was the last time current pos of work tape was visited.

looking at  $z_{\text{prev}(i)}$  we can see what symbol was written to work tape then. Is it consistent).

(1) - (3) uniquely determine  $z_i$

So  $\exists$  function  $f(z_i, z_{i-1}, y_{\text{inputpos}(i)}, z_{\text{prev}(i)})$

that evaluates to true when transition correct  
function of  $c + c + 1 + c$  bits = constant

Apply Prop 9  $\Rightarrow$  constant-size formula

L3 VII

Write down CNF formula  $F_x$  satisfying

- (1) First  $|x|$  bits on input tape are  $x$
- (2)  $z_1$  encodes starting position of TM
- (3) For every  $i > 1$ ,  $z_i$  is correct transition given  $z_{i-1}, y_{\text{input}(i)}, z_{\text{prev}(i)}$ .
- (4) The last snapshot  $^{z_{T(n)}}$  is that of an accepting computation ( $1$  is on the work tape).

Size of formula =  $T(n) \cdot (\text{exponential in } c)$

Can be computed in poly time

- First simulate  $M(x, O^P(|x|))$  to compute positions.
- Then output CNF encoding transitions for  $T(n)$  steps and correct conditions at start & stop.

Reducing from CNFSAT to 3-SAT

Straightforward exercise — see textbook.

Two observations

- (1) Formula  $F_x$  (and time to compute it) can be made very small —  $O(\tau \log \tau)$
- (2) From satisfying assignment to  $F_x$ , can read off witness  $w$  for  $x$

Lenin reduction

Now to prove NP-completeness of  $L$ ,  
sufficient to reduce from CNFSAT / 3-SAT.

And then to prove  $L'$  NP-complete, reduce  
from CNFSAT, 3-SAT, or  $L$ . Etcetera...

(And, in fact, on the positive side, many  
practical problems can be solved by reducing  
to CNFSAT and then solved if you have  
a good SAT solver — more about that later).

Reductions are all over complexity theory  
and have proven to be an extremely  
useful tool (and in TCS in general).

THM 10 ~~LINEAR PROGRAMMING~~ 0/1-INTEGER PROGRAMMING is  
NP-complete.

Proof Easy to verify suggested solution.

Reduction: Translate clauses to lin ineq

$$\begin{array}{l} x \rightarrow x \\ \overline{x} \rightarrow 1-x \end{array}$$

$$x \vee \overline{y} \vee z \rightarrow x + (1-y) + z \geq 1$$

This lin ineq satisfied by 0/1-assignment  
exactly when clause satisfied

3-COLOURING

Graph  $G = (V, E)$ , Colour vertices red/blue/green so that if  $(u, v) \in E$  then  $u$  and  $v$  have different colours.

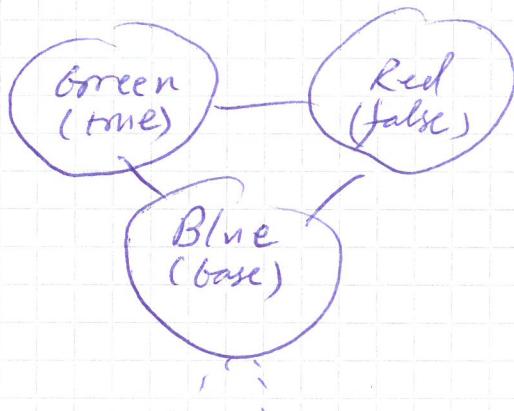
THEOREM 11

3-COLOURING is NP-complete

Proof Easy to verify a colouring.

Reduce from 3-SAT

Triangle

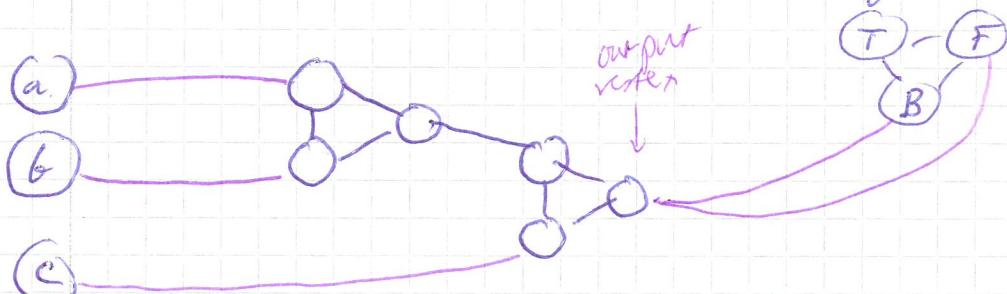


For each variable  $x$ :



connect both  $x$  and  $\bar{x}$  to Blue(base)

For clause  $a \vee b \vee c$  vertices  $a, b, c$  already exist.



Turns  $F$  into graph  $G_F$  L3 X

Need to prove

$F \text{ SAT} \Rightarrow G \text{ 3-colourable}$

$G \text{ 3-colourable} \Rightarrow F \text{ SAT}$

( $\Rightarrow$ ) Colours true literals green  
Colour false literals red  
Then output vertex <sup>of clause gadget</sup> can always be coloured green/true if clause contains true literal

( $\Leftarrow$ ) Given a colouring, identify  
T-colours with true  
F-colours with false

We get some truth value assignment since  $x$  and  $\bar{x}$  have opposite values.

Every clause gadget has output vertex coloured true

Only possible if some literal in clause true.

## Decision vs search

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### THEOREM

Suppose  $P=NP$ . Then for every NP language  $L$  with verifier  $M$  can find poly-time TM  $B$  that finds certificate for  $x$  (i.e., solves  $x$ ).

Proof sketch:

Start with CNFSAT

Given  $F = F(x_1, \dots, x_n)$

Set  $x=1$ , simplify, check if  $F|_{x=1}$  satisfiable  
If not check if  $F|_{x=0}$  satisfiable

Fix  $x=6$  so that  $F|_{x=6}$  sat, and now  
move on to  $x_2$

Will yield satisfying assignment.

For general  $L$ , reduce  $x \rightarrow F_x$ ,  
find sat assignment for  $F_x$ , read off a.

CNFSAT is downward self-reducible

Given an efficient algorithm that solves  
CNFSAT on input size  $< n$ , can solve  
CNFSAT instances of size  $n$ .

All NP-complete problems have similar property  
(follows from Cook - Levin)

For  $L \subseteq \{0,1\}^*$  language, the complement of  $L$  is  $\bar{L} = \{0,1\}^* \setminus L$

DEF

$$\text{coNP} = \{ L \mid \bar{L} \in \text{NP} \}$$

A side : if strings in  $L$  encode objects such as e.g. graphs, then we usually think of  $\bar{L}$  as only containing correctly encoded instances.

i.e.  $L$  and  $\bar{L}$  will both be graphs satisfying and not satisfying some property respectively, while "garbage strings" are not contained in either  $L$  or  $\bar{L}$ .

Not an issue, really

$\text{coNP}$  not the complement of  $\text{NP}$

Intersection non-empty

E.g.  $P \subseteq \text{NP} \cap \text{coNP}$  (why?)

Example CNFUNSAT  $\in$  coNP

In fact, CNFUNSAT is coNP-complete — any other coNP-language is reducible to it. Given  $L \in \text{coNP}$ , run Cook-Lenstra on  $\bar{L}$ .  $x \in L \Leftrightarrow x \notin \bar{L} \Leftrightarrow F_x \notin \text{CNFSAT} \Leftrightarrow F_x \in \text{CNFUNSAT}$

How is coNP related to NP?

Could there be short certificates that none of exponentially many assignments satisfy a formula?

Most researchers believe  $NP \neq coNP$   
We don't know, though.

Nondeterministic exponential time

DEF  $NEXP = \bigcup_{c \in \mathbb{N}} NTIME(2^{nc})$

clearly  $P \subseteq NP \subseteq EXP \subseteq NEXP$

Why care about such classes?

THEOREM If  $EXP \neq NEXP$ , then  $P \neq NP$

Proof Contrapositive: suppose  $P=NP$ , prove  $EXP=NEXP$

Suppose  $L \in NTIME(2^{nc})$ ; NTM M decides L.

Consider  $L_{pad} = \{ \langle x, 1^{2^{|x|^C}} \rangle : x \in L \}$

Claim  $L_{pad} \in NP$ . First check that input is in correct form then run M. Since input exp large, this is poly time. By assumption  $L_{pad} \in P$ .

But then  $L \in EXP$ . Namely given x, pad it with ones and then check whether new string is in  $L_{pad}$ .

PADDING Useful technique

to "scale up" or "scale down"  
results between weaker and  
stronger complexity classes

What does all of this mean?

Sec 2.7 in Arora - Barak highly recommended reading

Don't have time to discuss — our time is up.

TODAY Focus on NP and  
NP-completeness

Should have seen most of this before

Though probably not presented in this way

### FUTURE LECTURES

- Now stuff (probably)
- Can we separate cplx classes at all? Is P distinct from EXP?
- Can we say anything about landscape between P and NP?