

Algorithms - 2020

NP-Hard
(part 2)



Recap

- Hw ^(HW?) over flows:
 - now posted.
 - due next week -
oral grading on
next Thurs & Fri.
 - sign-up with group on
Canvas
- Reading:
 - Thursday this week
 - Switching to a different
book (still on Perusall)
for next week
 - Last reading: Sunday, Nov 15
- No class on Monday, Nov. 16
(rest of days as usual)
- Check for final exam conflict

Quantifying Hardness:

Fundamental question:

Are there "harder" problems?
How do we rank?

Polynomial
Hierarchy

↳ runtimes:

- linear
- - $n \log n$
- quadratic
- ⋮

polynomials
(in input)

?? → subexponential

Ex: factoring

→ exponential

(backtracking chapter)

→ worse? yes.

Undecidability:

Some problems are
impossible to solve!

The Halting Problem: (Turing & Church-30s?)
Given a program P and input I, does P halt or run forever if given I?
code: Python code
↪ infinite loop
Output: True / False ↪ decision
(Utility should be obvious!)

Note: Can't just simulate P on I. Why?

If it goes forever,
won't stop & let me
answer

↪ I don't know when
to output true.

Thm [Turing 1936]:

The halting problem is undecidable.

(That is, no such algorithm can exist.)

Proof: (by contradiction) - suppose we have such a program h :

$$\textcircled{h}(\underline{P}, \underline{I}) = \begin{cases} \text{True} & \text{if } P \text{ halts on } I \\ \text{False} & \text{otherwise} \\ & \text{(infinite loop)} \end{cases}$$

↑ ↑
program input

Need a contradiction now...

(see last notes)

So... what next?

Clearly, many things are solvable in polynomial time.

Some things are impossible.

But - what is in between?

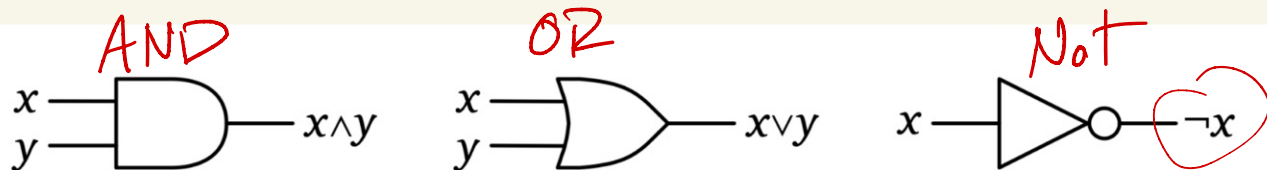
⤴?? what can we do?

Idea:

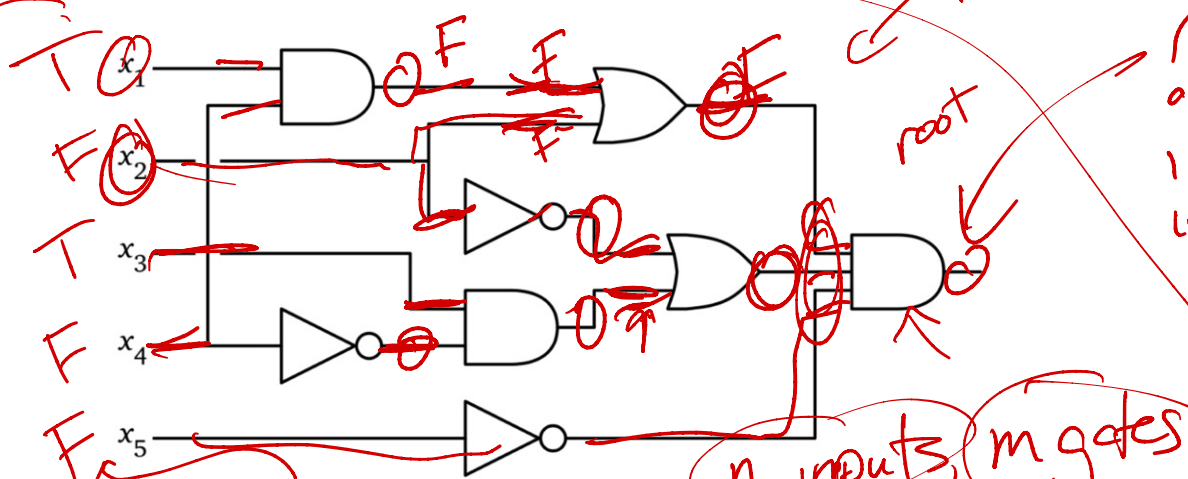
Set the idea of
what are limits
of (practical)
computing.

- If NP-Hard, reasonable
to use heuristics or
approximations.

The first problem found: Boolean circuits

$$\begin{array}{c|c} x & \neg x \\ \hline 0 & 1 \\ 1 & 0 \end{array}$$


An AND gate, an OR gate, and a NOT gate.



A boolean circuit. inputs enter from the left, and the output leaves to the right.

Given input, check if T in $O(n)$ time

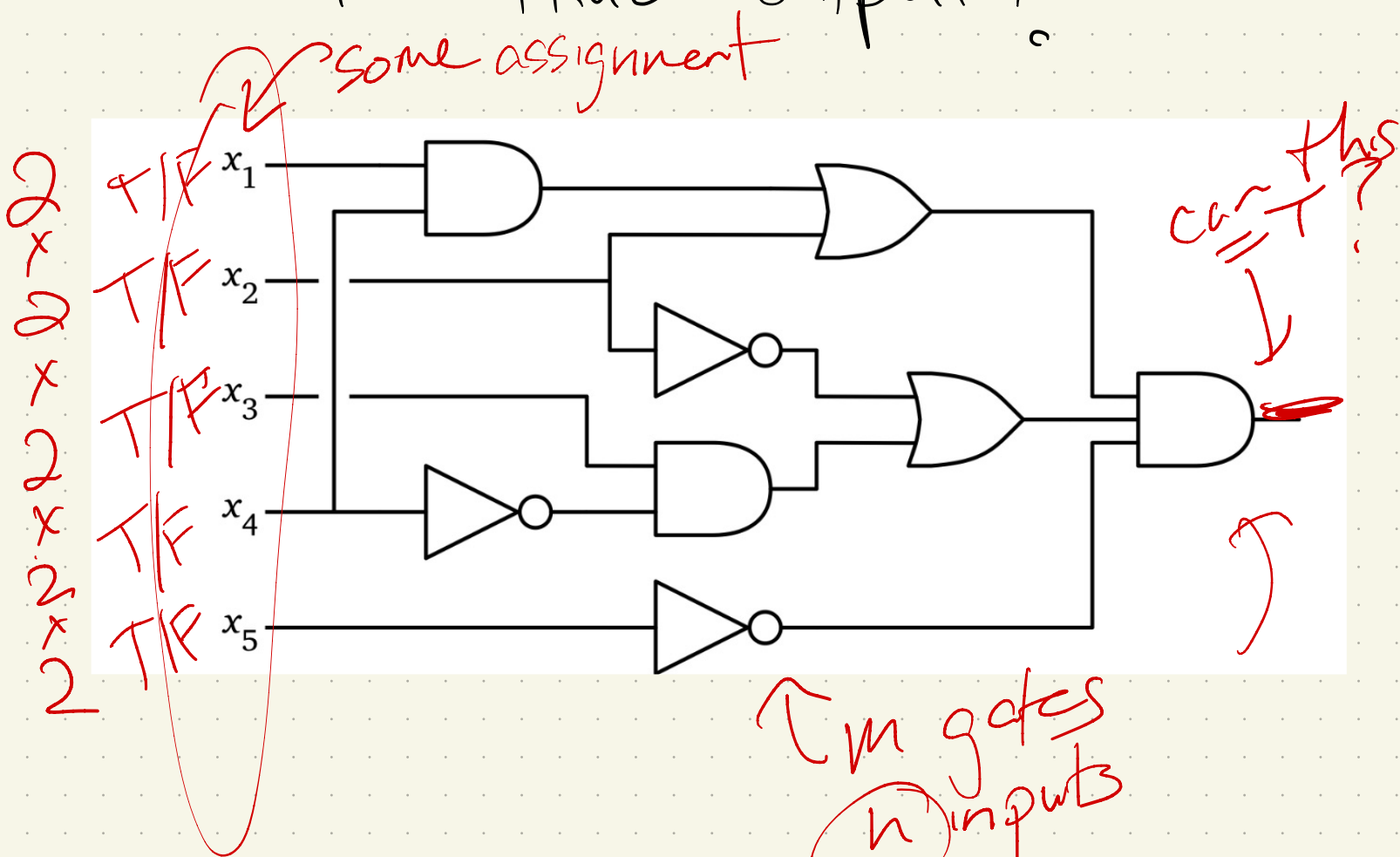
Given a set of inputs, can clearly calculate output in linear time ($n \# \text{inputs} + \# \text{gates}$)

How? Move from inputs "up" in tree

$$\begin{array}{cc|c} x & y & \text{output } x \wedge y \\ \hline 0 & 0 & 0 \\ 1 & 0 & 0 \\ 0 & 1 & 0 \\ 1 & 1 & 1 \end{array}$$

$$\begin{array}{cc|c} x & y & \text{output } x \vee y \\ \hline 0 & 0 & 0 \\ 0 & 1 & 1 \\ 1 & 0 & 1 \\ 1 & 1 & 1 \end{array}$$

Q: Given such a boolean circuit, is there a set of inputs which result in TRUE output?



Known as CIRCUIT SATISFIABILITY
(or CIRCUIT SAT)

"Clearly" check in exponential time!
 2^n possible T/F inputs
 for each, trace in $O(m+n)$ time

Best known algorithm:

try all possible 2^n inputs
if find true
output true
else False

Running time:

$$\hookrightarrow O(m+n)(2^n) = \underline{O(m2^n)}$$

check
each

Note:

Might be a polynomial
algorithm!
Hasn't been found yet.

P, NP, + co-NP

Consider only decision problems:

so Yes/No output

P:

Set of decision problems that can be solved in polynomial time.

$O(n) = n$
 n^2
 n^c constant

Ex:

Is this list sorted?
Is value x in list?
Is flow in G of value ≥ 25 ?

NP:

Set of problems such that, if the answer is yes & you hand me proof, I can verify/check in polynomial time.

$P \subseteq NP$
think $\neq$

Ex:

Circuit SAT

Is list sorted?

all of P

Co-NP:

Can verify a "No" answer sorted, is x in set, flow.

Ex: primality testing:

Is x prime?
 $\text{not } p \cdot q = x$

$P \subseteq \text{co-NP}$

- $P \subseteq NP$, $P \subseteq co-NP$
- $CircuitSAT \in NP$
 $\in co-NP$
 unknown if $CircuitSAT \in P$?

• primality testing:

→ "obviously" in $co-NP$

is it in NP or P ?

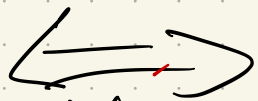
↳ in NP , not obvious

→ give you $p \neq q$ which
 you can multiply in
 $O(n) \neq x$?

Q: $NP = coNP$?
 (open)

Def: NP-Hard

X is NP-Hard



IF X could be solved in polynomial time, then

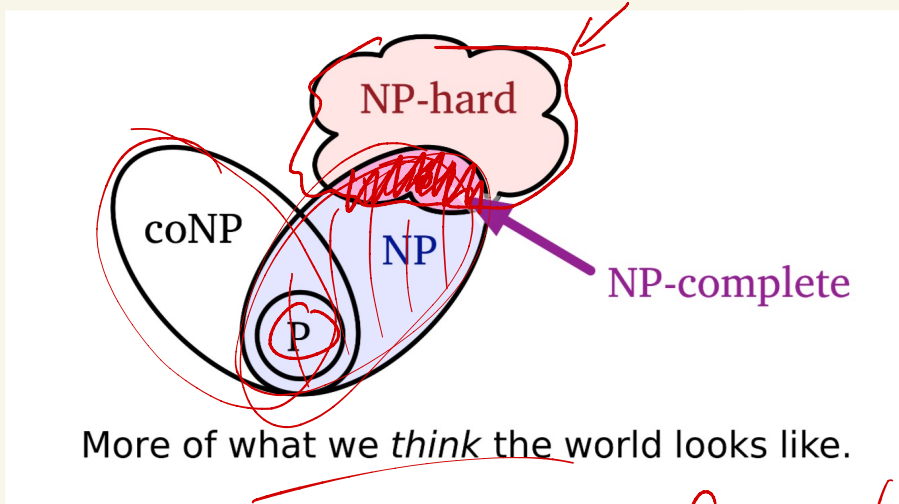
$P = NP$.

So if any NP-Hard problem could be solved in polynomial time, then all of NP could be.

Cook-Levine Thm:

Circuit SAT is NP-Hard.

unknown if
 $P = NP$?



(beyond scope of class)

NP-Complete: $\Leftrightarrow$

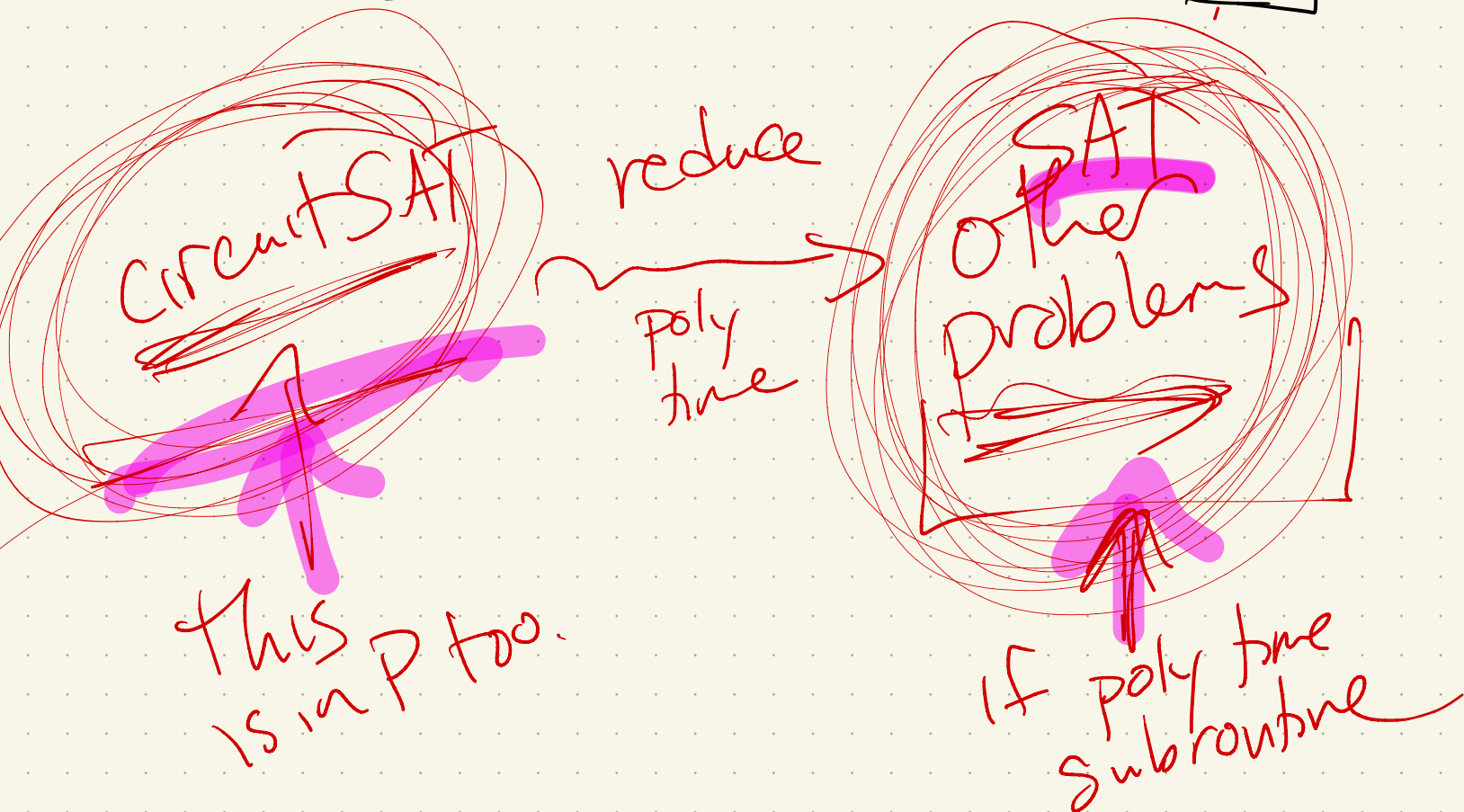
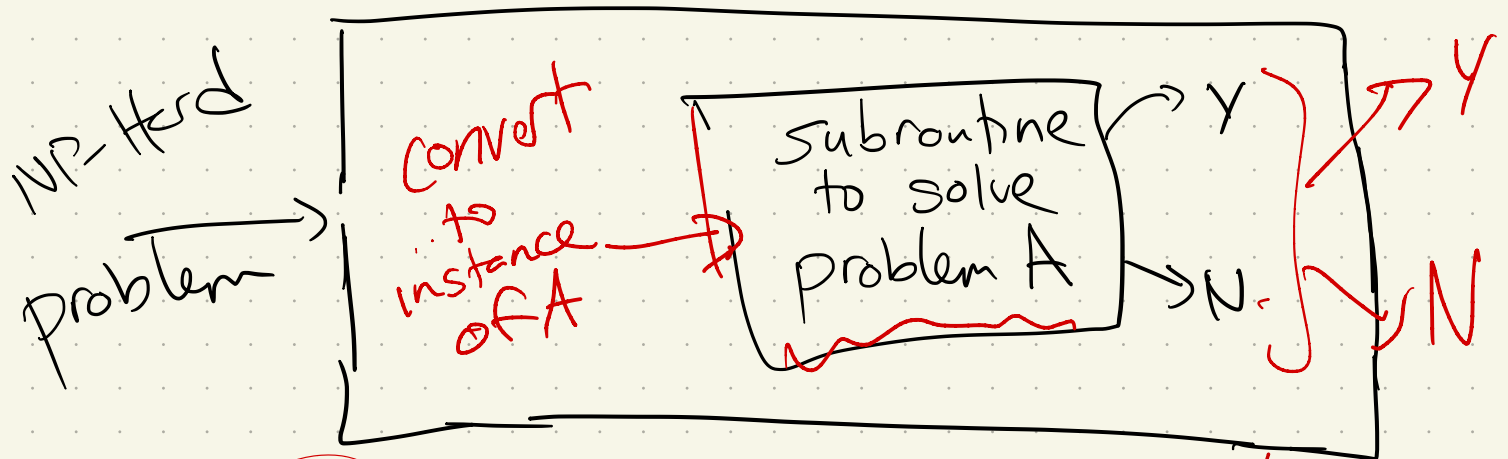
• in NP

• and is NP-Hard

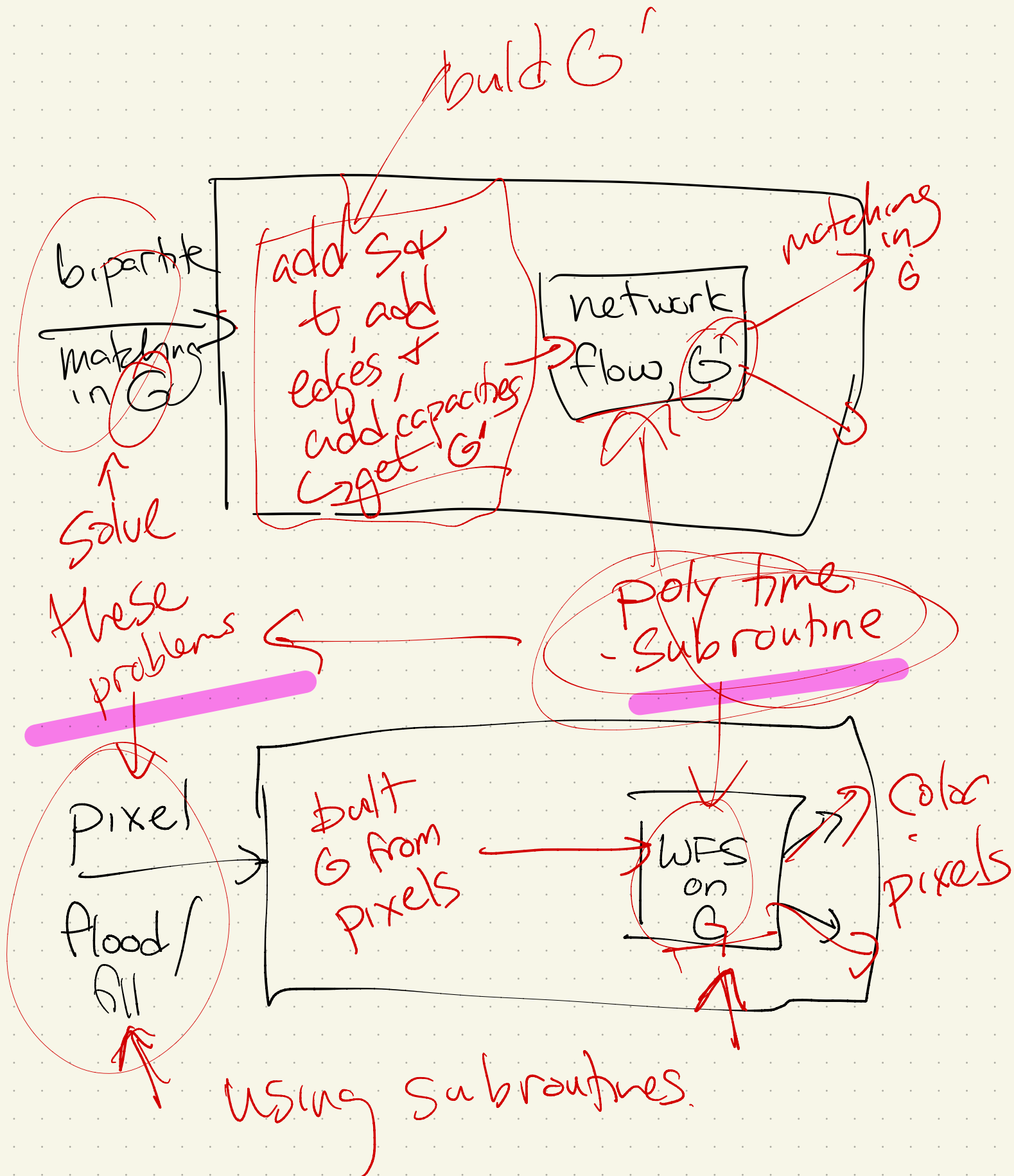
If in P also, then $NP = P$

To prove NP-Hardness of A:

Reduce a known NP-Hard problem to A.



We've seen reductions!



This will feel odd, though:

To prove a new problem is hard, we'll show how we could solve a known hard problem using new problem as a subroutine.

Why?

Well, if a poly time algorithm existed, then you'd also be able to solve the hard problem!

(Therefore, ^{red}"can't" be any such solution.)

Other NP-Hard Problems:

SAT: Given a boolean formula, is there a way to assign inputs so result is 1?

Ex: $(a \vee b \vee c \vee d) \Leftrightarrow ((b \wedge \bar{c}) \vee (\bar{a} \Rightarrow d) \vee (c \neq a \wedge b))$,
and, or, not, $\Rightarrow$, $=$ & $\neq$, " $\neg$ "
 $\begin{matrix} \text{a} & \text{b} & \text{c} & \text{d} & \text{D} & \text{F} \\ \text{T} & \text{T} & \text{T} & \text{T} & \text{T} & \text{F} \end{matrix}$
 n variables, here: $a, \dots, x_1, \dots, x_n$

m clauses: $5 = m$

In NP:

Given n T/F inputs,
scan the clauses &
check each in $O(1)$

Total: $O(n+m)$

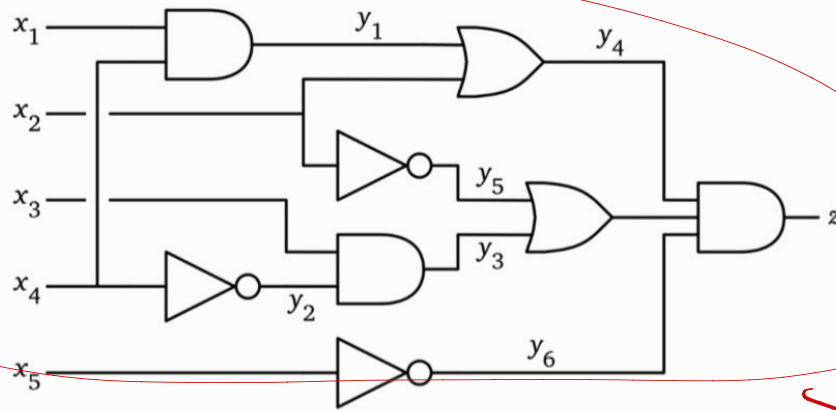
$n \cdot m$ if clauses
are $O(n)$ long

poly!

Thm: SAT is NP-Hard.

pf: Reduce CIRCUIT SAT to SAT:

known NP-Hard
new one



$$(y_1 = x_1 \wedge x_4) \wedge (y_2 = \overline{x_4}) \wedge (y_3 = x_3 \wedge y_2) \wedge (y_4 = y_1 \vee x_2) \wedge \\ (y_5 = \overline{x_2}) \wedge (y_6 = \overline{x_5}) \wedge (y_7 = y_3 \vee y_5) \wedge (z = y_4 \wedge y_7 \wedge y_6) \wedge z$$

A boolean circuit with gate variables added, and an equivalent boolean formula.