

CSE 373: P vs NP; reductions

Michael Lee

Wednesday, Mar 7, 2018

Warmup

Remind your neighbor:

- ▶ What is a decision-problem?
- ▶ What is P, EXP, and NP?

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 2. EXP is the set of all decision problems that can be *solved* in worst-case *exponential* time

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- ▶ What is P, EXP, and NP?
 1. P is the set of all decision problems that can be *solved* in worst-case *polynomial* time
 2. EXP is the set of all decision problems that can be *solved* in worst-case *exponential* time
 3. NP is the set of all decision problems where we can *verify* all “yes” answers in worst-case *polynomial* time

Final logistics:

- ▶ Thursday, March 15
- ▶ 2:30 to 4:20
- ▶ Gowen 301

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Review sessions:

- ▶ Monday, Mar 12: EEB 125, 4:30 to 6:30
- ▶ Tuesday, Mar 13: EEB 105, 4:30 to 6:30

Final

The final will be cumulative, but skewed towards new material.

Post-midterm topics:

1. Heaps

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 - ▶ Representation
 - ▶ Traversal
 - ▶ Dijkstra's
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 - ▶ MSTs (Prim, Kruskal, disjoint sets)

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3. Caching and locality

General study tips for mechanical problems:

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4. For each data structure and algorithm we've studied, try writing a document summarizing (a) the high-level idea of how to implement them and (b) the best, average, and worst-case runtimes.
5. Think about what would happen if you were to tweak some aspect of a data structure or algorithm

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General tips when asked to write pseudocode:

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2. Try writing an algorithm that works on a specific example first, then figure out how to generalize.

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Now:

- ▶ Your lowest-scoring exam will be 15% of grade
- ▶ Your highest-scoring exam will be 25% of grade

Recap

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Last time:

- ▶ Introduced the idea of decision problems and complexity classes
- ▶ Introduced the complexity classes P and EXP
- ▶ Found some (useful!) problems are, unfortunately, in EXP
- ▶ But many of those problems are also in NP!
- ▶ Question: if there are problems where we can *verify* answers efficiently, does that mean we can also *find* answers efficiently?

Is CIRCUIT-SAT in NP?

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CIRCUIT-SAT

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Given a boolean expression such as “a && (b || c)” and the truth values for **some** of the variables, is there a way to set the remaining variables so that the output is T?

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Step 1: Assume you have a magical solver, and it said “yes” for some boolean expression B .

Step 2: Three questions to answer.

1. How do we modify the solver so it returns a convincing certificate for B ?
2. How do we check the certificate, whatever it is?
3. Does our verifier actually run in polynomial time?

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{a=true, b=false, c=true, d=false, ...}

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Idea: try evaluating the expression!

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boolean verifyCircuitSat(BooleanAst B, Dictionary<String, Boolean> certificate) {  
    return evaluateExpr(B, certificate);  
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private boolean evaluateExpr(B, certificate) {  
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2c: Does our verifier actually run in polynomial time?

Yes: we visit each node and edge in the tree a constant number of times.

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- ▶ 3-COLOR easier or harder than CIRCUIT-SAT?

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Core ideas: If solving A lets us also solve B , then...

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- ▶ A was “harder than” (or the same as) B
- ▶ The B was really a special case of A all along!
- ▶ We've *reduced* the number of distinct problems in the world by one.

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Answer:

1. Start by adding a new vertex to the graph
2. Connect this vertex to all other nodes
3. Give this vertex some color. This forces all other vertices to have a only one of two colors!
4. Run the solver for 3-COLOR, return the result

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- ▶ To show two functions $f(n)$ and $g(n)$ are asymptotically the same, we can show that $f(n)$ both dominates and is dominated by $g(n)$
- ▶ To show two decision problems A and B are the same, we can show that A reduces to B and B reduces A !

LONG-PATH and HAM-PATH

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Given a graph G and some integer k , does G contain some path that uses k edges?

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Reduce HAM-PATH to LONG-PATH

Note: paths can't revisit the same node

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Step 2:

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boolean longPathSolver(G, k) {  
    for (G2=(v1, v2, ..., vk) : G):  
        if (hamPathSolver(G2)):  
            return true;  
    return false;  
}
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Equivalent problems

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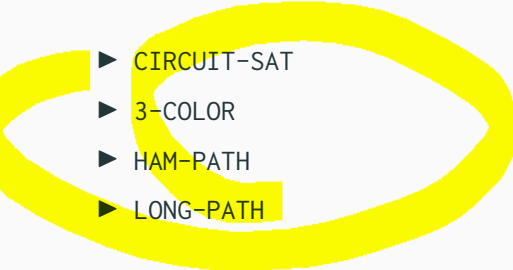
Question: Are there other problems that are secretly the same problem in disguise?

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Question: Are there other problems that are secretly the same problem in disguise?

Yes! It turns out that...

- 
- ▶ CIRCUIT-SAT
 - ▶ 3-COLOR
 - ▶ HAM-PATH
 - ▶ LONG-PATH

...are all the same problem.

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Alternative phrasing: if every single decision problem in NP reduces to X , then X is NP-HARD.

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NP-COMPLETE

A decision problem is NP-COMPLETE if it is both in NP and in NP-HARD.

Punchline: If we have a way of solving any NP-HARD problem, we have a way of solving *every* problem we've looked at so far.

NP-HARD and NP-COMPLETE

How do these relate?

NP-HARD and NP-COMPLETE

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How do all relate to P?

Is P a subset of EXP ?

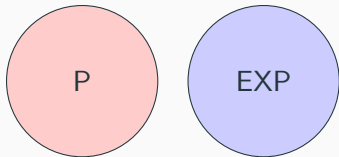
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Is P a subset of EXP?

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Answer 1: The sets are disjoint

E.g. if a problem is in P, it's not in EXP.

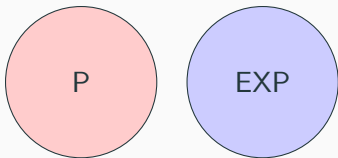


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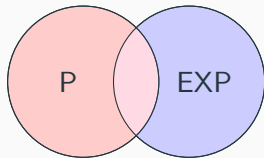
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Answer 2: The sets overlap

E.g. some, but not all problems in P are in EXP

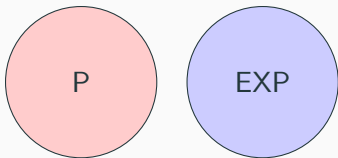


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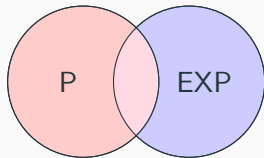
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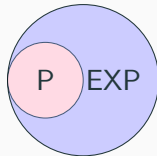
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Answer 3: P is a subset of EXP

All problems in P are also in EXP



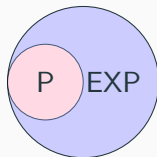
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It turns out, yes, P is indeed a subset of EXP:

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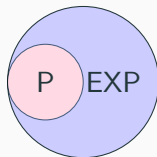
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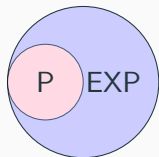
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Reason: EXP is the set of decision problems where there exists an algorithm that solves the problem in *worst-case exponential time*.

So, if we can find a polynomial-time algorithm to a problem, we can definitely find an exponential one!

Is P a subset of NP?

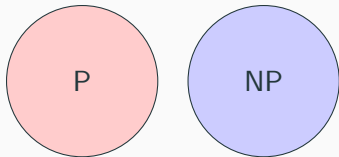
New question: is a P a subset of NP?

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Answer 1: The sets are disjoint

E.g. if a problem is in P, it's not in NP.

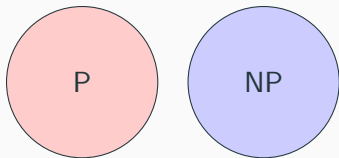


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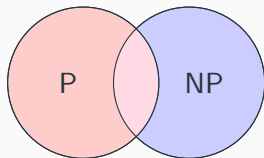
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E.g. some, but not all problems in P are in NP

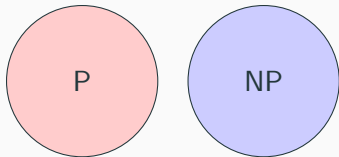


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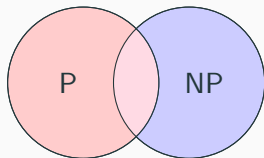
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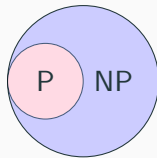
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Answer 3: P is a subset of NP

All problems in P are also in NP



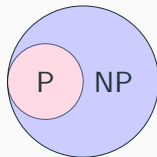
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It turns out, yes.

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3. Does our verifier actually run in polynomial time?

Yep. If X was originally in P, then we know by definition solverX runs in polynomial time.

Is P a subset of NP?

Punchline: For any problem in P, we can build a verifier by just re-using the solver!

Is $P = NP$?

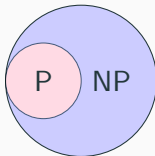
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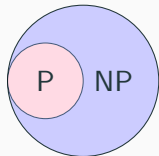


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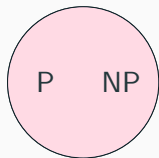
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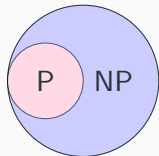


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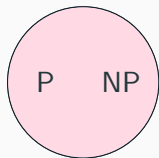
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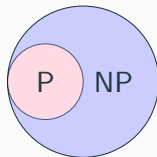
Answer: We don't know.

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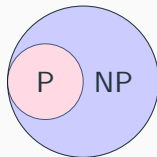


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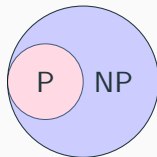
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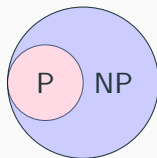
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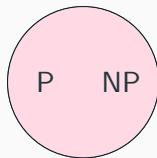
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- ▶ Something something quantum computing? (Lots of caveats, not practical right now, doesn't solve everything, even if they work.)

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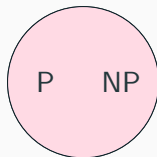
What if this is reality?



What if $P = NP$?

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AND what if we have an efficient way of solving any NP-COMPLETE problem?

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