## Review for CMSC 452 Midterm: P and NP

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We first look at some problems of interest.

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To even ask these questions we need (1) a standard way to describe sets and a (2) model of computation.

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We Sometimes Cheat We may take the length of a formula to be the number of vars. We may take the length of a graph to be the number of vertices. These notions of length are poly-related to the actual length and hence is fine for our purposes.

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Here is all you need to know:

1. Everything computable is computable by a Turing machine.
2. Turing machines compute with discrete steps so one can talk about how many steps a computation takes.
3. There are many different models of computation. They are all equivalent to Turing machines. And better- they are all equivalent within poly time.

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These definitions are model independent.

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For the above sets: If $x$ is a member then there is a short verifiable witness of this.

## NP

Def $A$ is in NP if there exists a set $B \in \mathrm{P}$ and a polynomial $p$ such that

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- So if I wanted to convince you that $x \in A$, I could give you $y$. You can verify $(x, y) \in B$ easily and be convinced.
- If $x \notin A$ then there is NO proof that $x \in A$.

Note 3SAT, HAM, EUL, CLIQ are all in NP.

## Our Plan for NP

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So is

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\text { IS }=\{(G, k): G \text { has an Ind Set of size } k\} .
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Call this algorithm ALG. On next slide we use ALG to show that IS $\in \mathrm{P}$ implies $3 \mathrm{SAT} \in \mathrm{P}$.

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This is an algorithm for 3SAT that takes time

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p(|\phi|)+r(q(|\phi|))
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## By the Cook-Levin Theorem Have the Converse

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Much More is Known The following are all in P or all NOT in P:
HAM, 3SAT, IS, 3COL, CLIQ.

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Contrapositive If $X \leq Y$ and $X \notin \mathrm{P}$ then $Y \notin \mathrm{P}$.

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Since then thousands of problems have been shown NP-complete.

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4. HAM is NP-complete. Just take my word for it.
