

Is  $P = NP$ ?

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- ▶ The classes NPC and NPH.

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But if someone gives you a proof that a graph has a size  $k$  IS, can we check it quickly?

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Similar to Sudoku? How do you prove that there is no solution to a given Sudoku puzzle?

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- ▶ NO answers: not clear!

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Formal definition: Class of problems having a "polytime verifier".

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No  $y$  should fool  $\text{Verify}$  into certifying that  $x$  is true.

- ▶  $y$  has length  $\text{poly}(|x|)$  : proof is short.
- ▶  $\text{Verify}$  runs in polytime: proofs can be checked quickly.



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Make sure that Verify satisfies required conditions..



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So current belief:  $P \subset NP$ .

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- ▶ We show next that all problems in NP have a Karp reduction to CSAT.
- ▶ Thus showing that a problem has a polytime verifier is an easy way to reduce it to CSAT.
- ▶ So it is not just a cute definition or taxonomy.

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Does this run in polytime?

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Prove that (1)  $R \in \text{NP}$ . (2) Some NPC problem reduces to  $R$ .

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- ▶ Usually it is easy to show that a given problem is in NP. The key point usually is what proof you will use. Be sure to mention this very clearly.
- ▶ Proving NP-hardness is often non trivial. Note the direction of reduction. Some known NP-complete problem must be reduced to the problem you are considering. Doing it in the reverse direction is useless!