

# Complexity Classes and Polynomial Reductions

Algorithms and Complexity Theory

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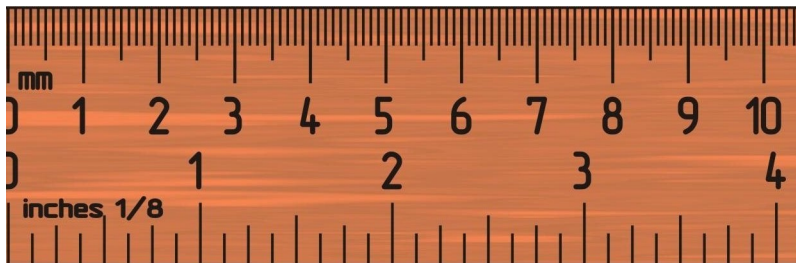
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*Is it possible to construct a **hierarchy** of problems, based on hardness ?*

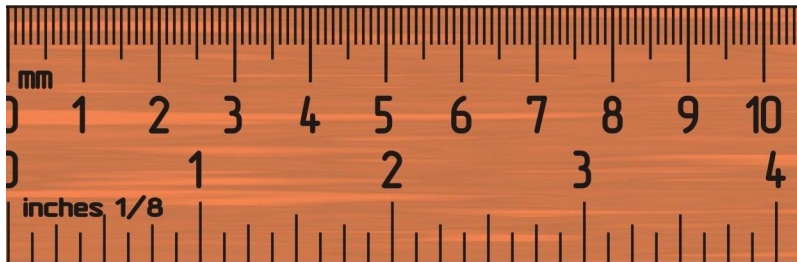
# A hierarchy of complexity classes

$P$



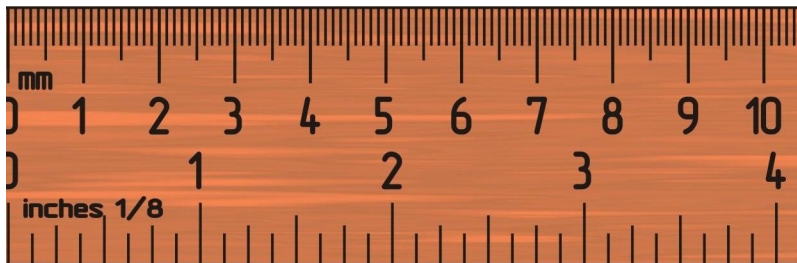
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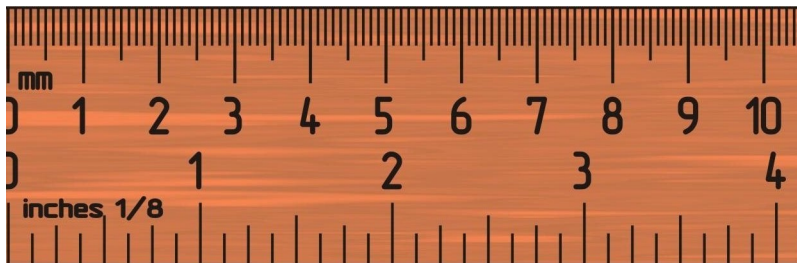
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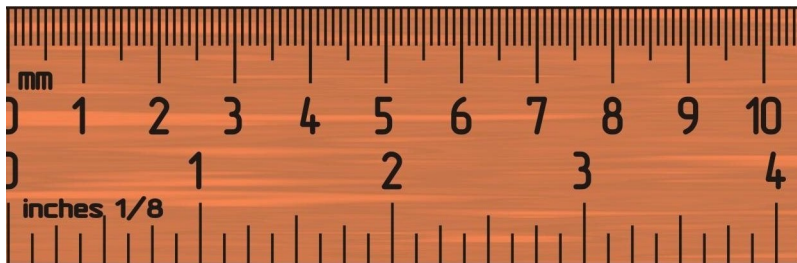
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- to answer *yes* to this problem means to answer *no* to its complement

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    - Planning problems in: HPC systems, air space control, etc. are **feasible**.

# Classifying a problem

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- Given a problem  $\mathbf{Q}$  and a complexity class  $X$  such that  $\mathbf{Q} \in X$ , then  $X$  is an **upper bound** on the difficulty of  $\mathbf{Q}$
- How can we provide with **lower bounds** for  $\mathbf{Q}$  ?

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Let  $X$  be a complexity class and  $Q$  be a problem. We say  $Q$  is  **$X$ -hard** if  $Q' \leq_p Q$ , for all  $Q' \in X$



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## Proposition (Tool for proving hardness)

Let  $Q, Q'$  be two problems such that  $Q'$  is  $X$ -hard and  $Q' \leq_p Q$ .  
Then  $Q$  is  $X$ -hard.

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- Let  $Q$  be an  $NP$ -complete problem. Then  $Q$  is one of the **hardest** problems in  $NP$ . (All  $NP$ -complete problems are *equally hard*)
- Finding **lower bounds** for a problem  $Q \equiv$  proving **hardness** w.r.t. a complexity class  $X$ .

# New implications

## Proposition

*Let  $Q$  be NP-hard and also  $Q \in P$ . Then  $P = NP$ .*

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*I conjecture that there is no good algorithm for the travelling salesman problem. My reasons are the same as for any mathematical conjecture: (i) it is a legitimate mathematical possibility, and (ii) I do not know. (Jack Edmonds, 1966)*

*There exist problems which **cannot be solved**  
**efficiently** ?*

- How do we formally express that a problem is **solvable** ?
- Is it the case that, *finding the correct answer* is **harder** than *checking if a **given answer is correct*** ?
- How do we express that a problem is **harder** than another problem ?
- Is it possible to construct a **hierarchy** of problems, based on hardness ?

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