

P VERSUS NP

A MILLION-DOLLAR QUESTION (AND MORE)

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Izleti v matematično vesolje

Univerza na Primorskem

November 24, 2021



AHHH ... SWEET 60S ...



Source: computerhistory.org



Source: flickr.com, ArnoldReinhold

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Source: computerhistory.org

AHHH ... SWEET 60s ...



Source: chilton-computing.org.uk

AHHH ... SWEET 60S ...



Source: nersc.gov

HARD OR EASY, THAT IS THE QUESTION

HARD TO SOLVE

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Every problem in **P** is also in **NP**!

The **P** versus **NP** question asks whether **finding** a solution is as easy as **checking** a solution.

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An efficient algorithm for an **NP-complete** problem would provide an efficient algorithm for **every** problem in **NP**, therefore showing that **P = NP**.



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Leonid Levin (1980s)



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Input: A boolean expression ϕ .

Question: Is ϕ satisfiable?



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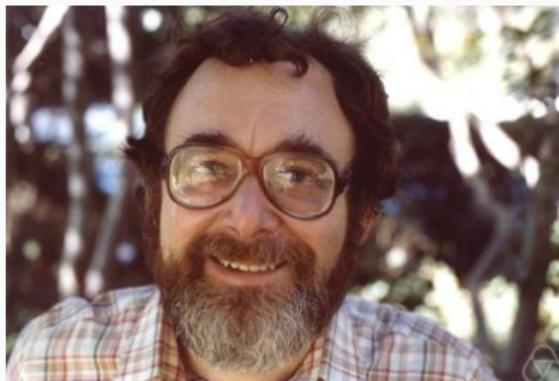
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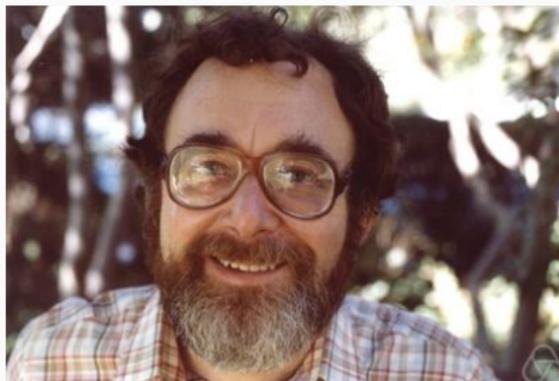
Question: Is ϕ satisfiable?

Let $\phi = (x_1 \text{ OR } x_2) \text{ AND } (\bar{x}_1 \text{ OR } x_2 \text{ OR } x_3) \text{ AND } (x_1 \text{ OR } \bar{x}_3) \text{ AND } (\bar{x}_2 \text{ OR } \bar{x}_3)$.
Then ϕ can be satisfied by setting $x_1 = \text{true}$, $x_2 = \text{true}$, and $x_3 = \text{false}$.



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Nowadays, thousands of problems are known to be **NP**-complete.

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$n = 50$	$2^{50} > 10^{15}$	> 348 years

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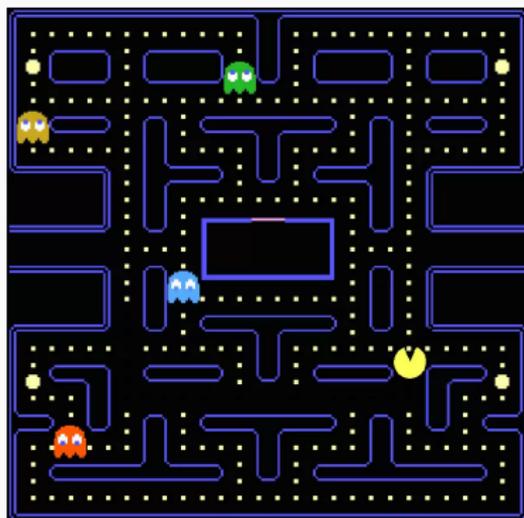
5	3			7				
6			1	9	5			
	9	8					6	
8				6				3
4			8		3			1
7				2				6
	6					2	8	
			4	1	9			5
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SOME (FUN) NP-HARD AND NP-COMPLETE PROBLEMS

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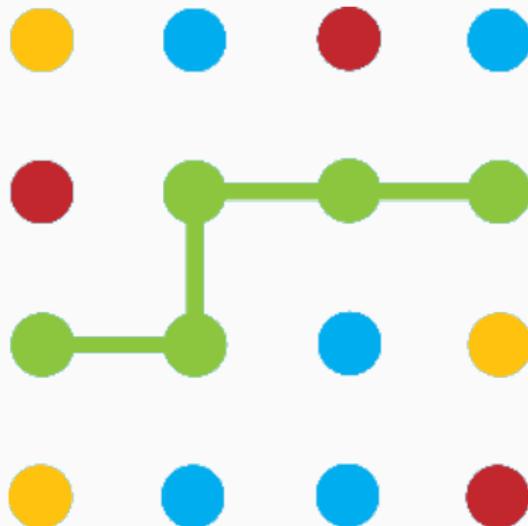


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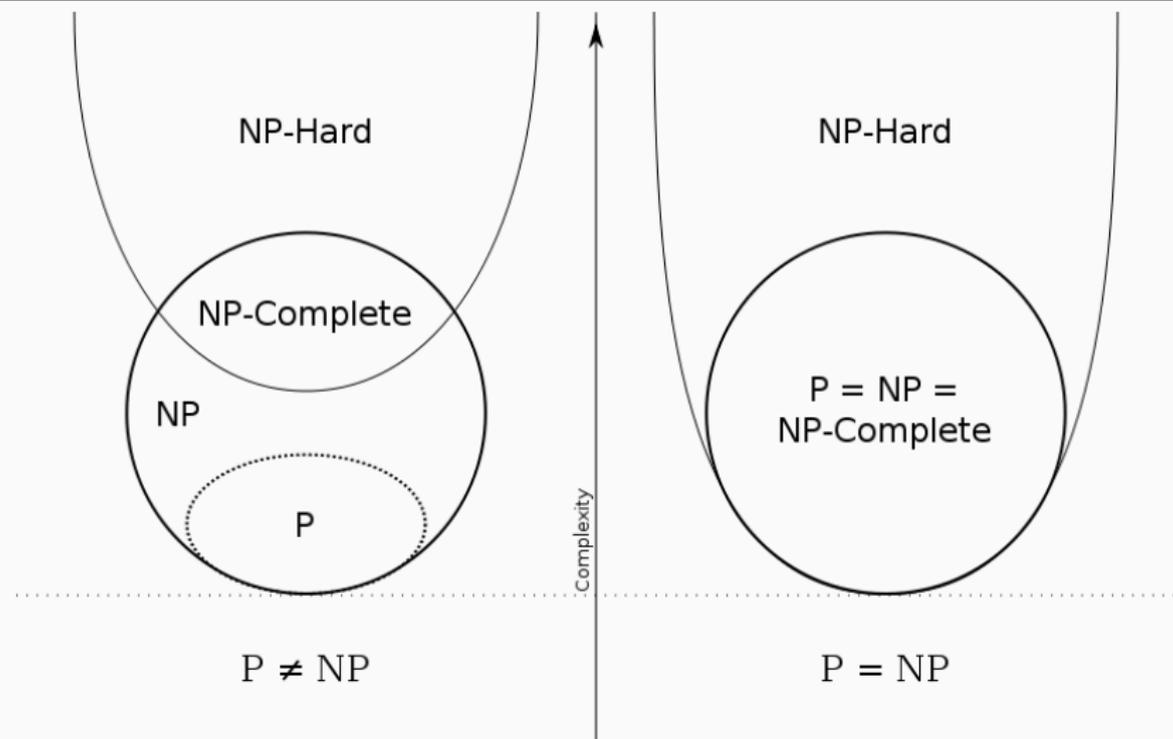


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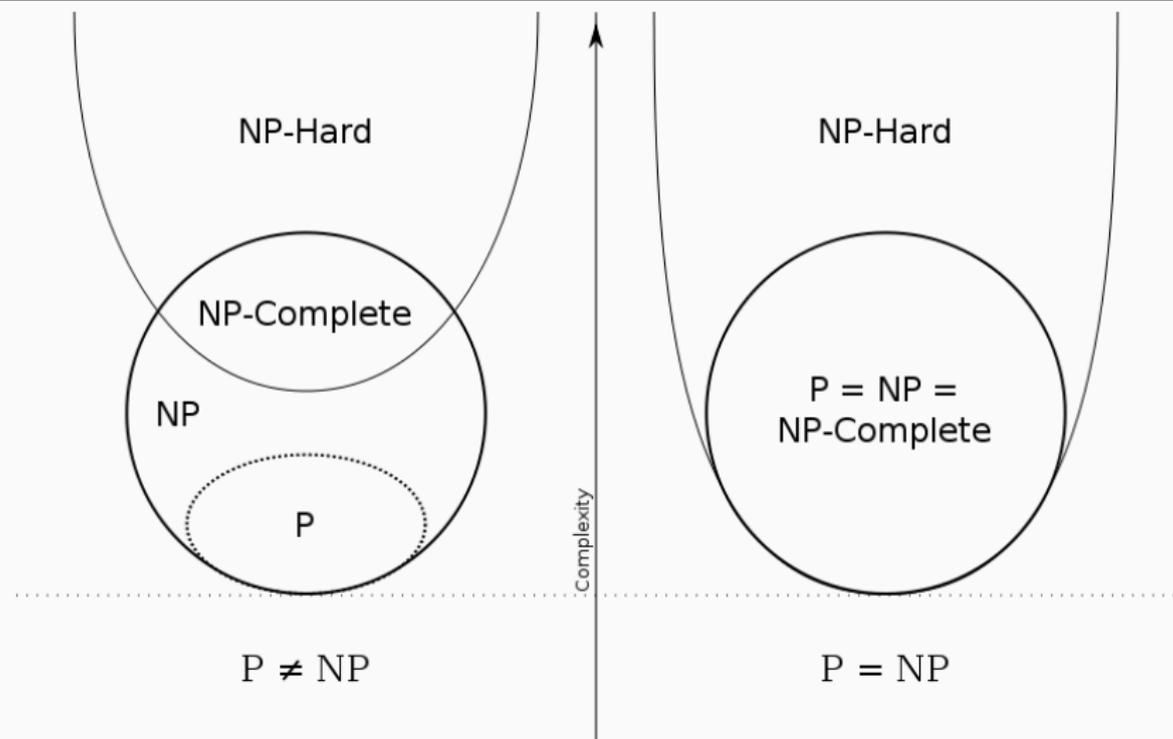
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- **Angry Birds**: NP-complete
(Stephenson, Renz, and Ge, 2017)



A GLIMPSE AT THE COMPLEXITY ZOO



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If $P \neq NP$, then we know that there are problems in **NP** that are neither **NP-complete** nor in **P** (Ladner, 1975).

Millenium prize problems (Clay institute):

- Yang–Mills and Mass Gap
- Riemann Hypothesis
- **P vs NP Problem**
- Navier–Stokes Equation
- Hodge Conjecture
- Poincaré Conjecture
- Birch and Swinnerton-Dyer Conjecture

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- **Poincaré Conjecture (solved by Perelman, 2003)**
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If you prove that $P = NP$ by providing an **efficient** algorithm for an **NP**-complete problem, **don't say anything to anyone** (except me).

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If we only have a **non-constructive proof** or a “**not efficient enough**” algorithm:

- a scientific accomplishment, although somewhat frustrating;
- nothing else really changes, but we should be ready to update our encryption algorithms!

Well, that's (almost) life as we know it today ...

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We would feel better when we don't finish a Sudoku grid!

The NUMBER SCRABBLE game:

- two players take turn to select numbers from 1 to 9 without repeating any numbers already selected;

1 2 3 4 5 6 7 8 9

Player 1:

Player 2:

The NUMBER SCRABBLE game:

- two players take turn to select numbers from 1 to 9 without repeating any numbers already selected;
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Player 1:

3 5

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If displayed as a **magic square**:

2	7	6
9	5	1
4	3	8

Maybe we just haven't found **yet** an efficient algorithm to solve **NP**-complete problems!

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Besides, some problems have been proved to belong to **P** only after several years of research ...

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If $P = NP$, then the world would be a profoundly different place than we usually assume it to be. There would be no special value in “creative leaps,” no fundamental gap between solving a problem and recognizing the solution once it’s found. Everyone who could appreciate a symphony would be Mozart; everyone who could follow a step-by-step argument would be Gauss; everyone who could recognize a good investment strategy would be Warren Buffett.

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Given how many confusions and weird misinterpretations it’s spawned, I, Scott Aaronson, hereby formally disown my statement about how “everyone who could appreciate a symphony would be Mozart” if $P = NP$.

Scott Aaronson

Maybe the **P** versus **NP** question simply **not provable** in any of the current logical theories.

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- **Heuristics**: don't compute an optimal solution, just try to not be too bad.
- **Specific inputs**: develop efficient and optimal algorithms for specific kind of inputs.
- **Improve the base of the exponent**: 1.234^n grows way slower than 2^n .

BQP is the class of problems that **can be solved efficiently** with an error probability of at most $1/3$ (for all inputs) **on a quantum computer**.

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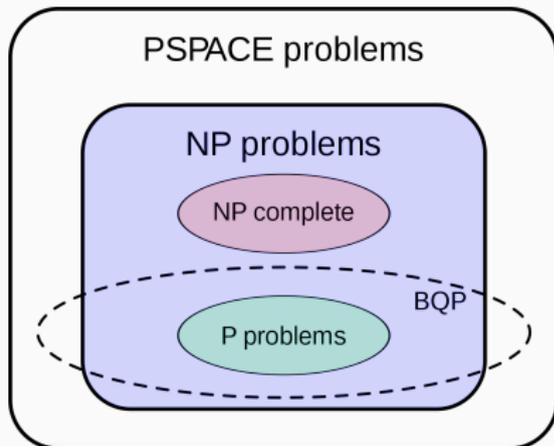
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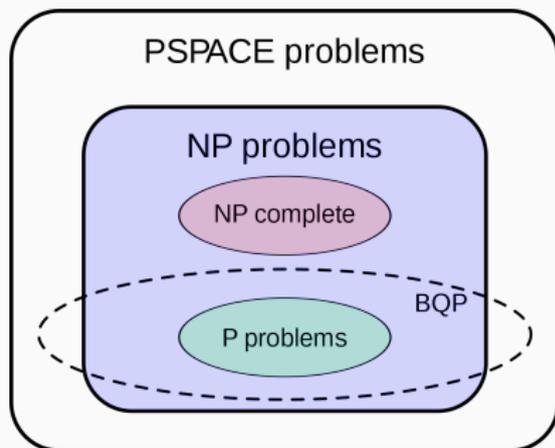
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- It is believed that $NP \not\subseteq BQP$.
- We can solve some problems efficiently on quantum computers, including PRIME FACTORIZATION, but no NP-complete problem.



Suspected relationship of BQP with NP

Thank you!
Questions?