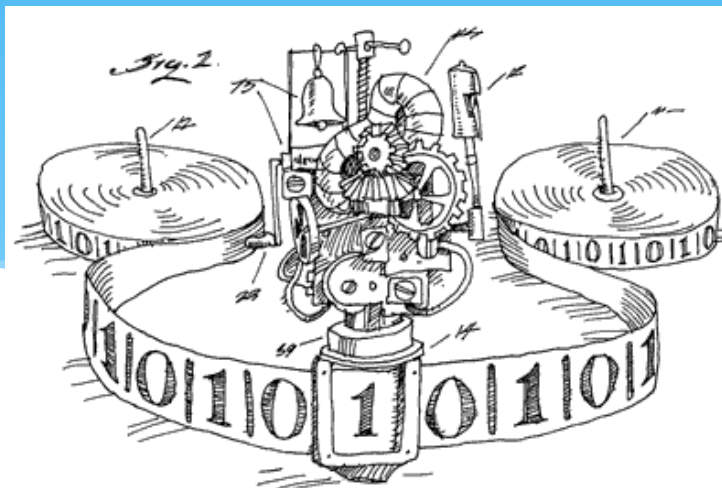


EECS 376: Foundations of Computer Science

Chris Peikert

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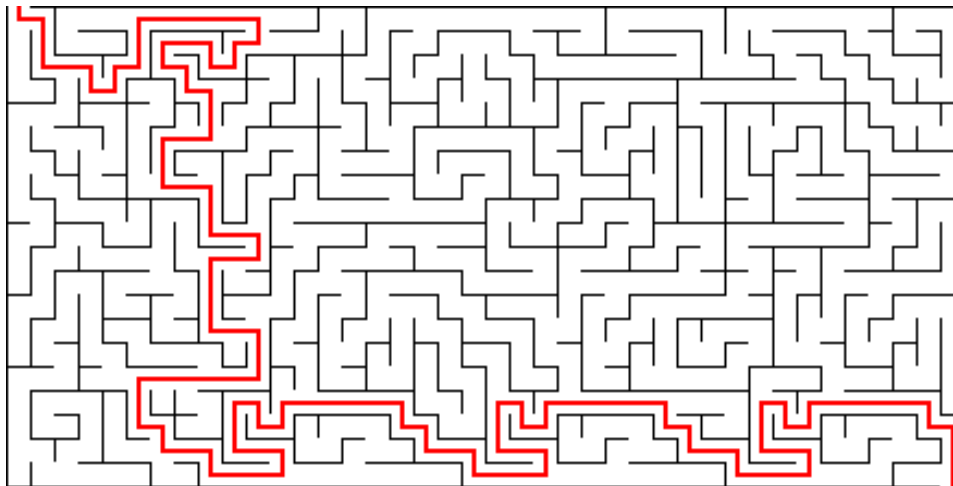


Today's Agenda

- 1) Recap: NP (efficiently verifiable languages)
- 2) Satisfiability Problem: SAT
- 3) Cook-Levin Theorem:
 - SAT is “as hard as” *any* problem in NP

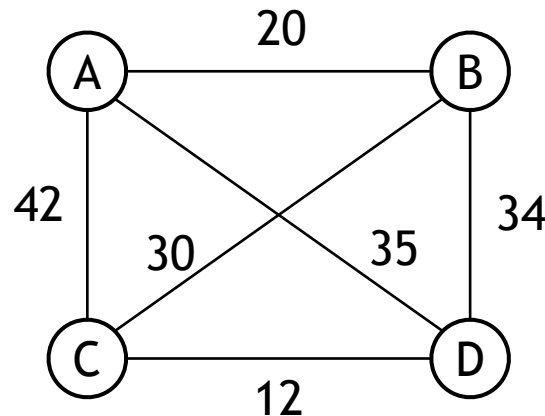
Verifiable Problems

- * **Example 1:** Given a maze, is there a route through the maze from the start to finish?
- * **Answer (from wizard):** Yes; see the route below.
- * **Response:** We follow the route and are convinced.



Efficiently Verifiable Problems

- * **Example 2: TSP (decision version):**
Given 4 cities and pair-wise distances between them, is there a cycle of length at most 100 through all the cities?
- * **Answer (from wizard):** Yes; $A \rightarrow B \rightarrow C \rightarrow D \rightarrow A$.
- * **Response:** We check that this visits all the cities in a cycle, compute the cost $20+30+12+35 = 97 < 100$, and are convinced.



The Class NP

- * **Definition:** A decision problem L is *efficiently verifiable* if there exists an algorithm $V(x, c)$, called a *verifier*, satisfying:
1. $V(x, c)$ is *efficient* with respect to x , i.e., polynomial time in $|x|$.
 2. For every $x \in L$, there exists some c such that $V(x, c)$ accepts.
 3. For every $x \notin L$, $V(x, c)$ rejects for all c .

Given 1, conditions 2+3 are equivalent to:

$$x \in L \iff \exists c \text{ s.t. } V(x, c) \text{ accepts.}$$

Definition: the class **NP** = the set of all efficiently verifiable languages.

i.e.: $L \in \mathbf{NP}$ if L is efficiently verifiable.

Practice with Verifiers

$L_{Comp} = \{n : n \text{ is composite (not prime)}\}$

$L_{HAM} = \{G : G \text{ has a Hamiltonian cycle}\}$

$L_{Primes} = \{n : n \text{ is prime}\}$ (complement of L_{Comp})

Not obvious. But there is a clever verifier and cert! [Pratt 1975]

$L_{non-HAM} = \{G : G \text{ has no Hamiltonian cycle}\}$

We **do not expect** the problem to have an efficient verifier!
(Would have very surprising consequences.)

P vs NP

- * $L \in \mathbf{P}$ if there is a polynomial-time (in $|x|$) algorithm M where:
 - * $x \in L \implies M(x)$ accepts
 - * $x \notin L \implies M(x)$ rejects

$x \in L \iff M(x) \text{ accepts}$
- * $L \in \mathbf{NP}$ if there is a polynomial-time (in $|x|$) algorithm V where:
 - * $x \in L \implies V(x, c)$ accepts for some c
 - * $x \notin L \implies V(x, c)$ rejects for every c

$x \in L \iff \exists c : V(x, c) \text{ accepts}$
- * **Observe:** $\mathbf{P} \subseteq \mathbf{NP}$ ($V(x, c)$ can ignore c and just run $M(x)$.)
- * **\$1,000,000 question:** Is $\mathbf{P} = \mathbf{NP}$?
 Is every efficiently verifiable problem
 also efficiently solvable?
 Seems unlikely... but we don't know for sure!

What P vs NP is “About”

Intuitively: **Verifying** a correct solution **seems much “easier”** than **finding** one (or even determining if there is one).

Examples: TSP, Ham-Cycle, Subset-Sum, **Sudoku**, **376 Homework**, ...
All these problems are in NP — but we don’t know if they are in P!

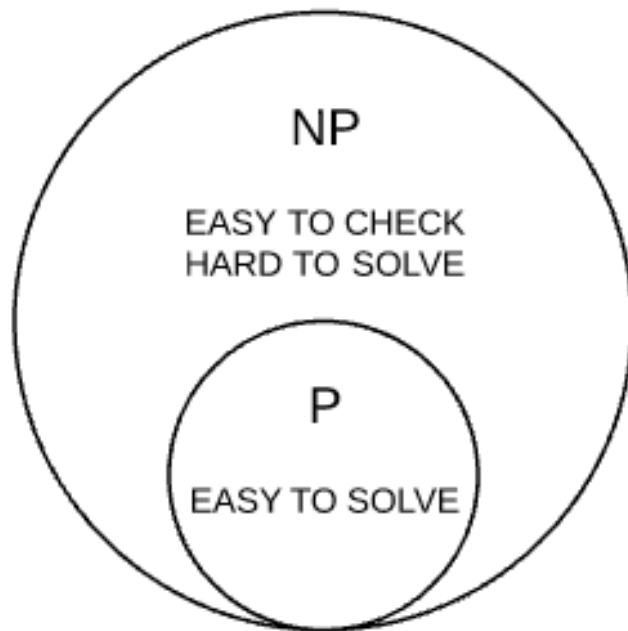
Major open question (P vs NP): Does $P = NP$?
Is every efficiently verifiable problem also efficiently solvable?

P vs NP

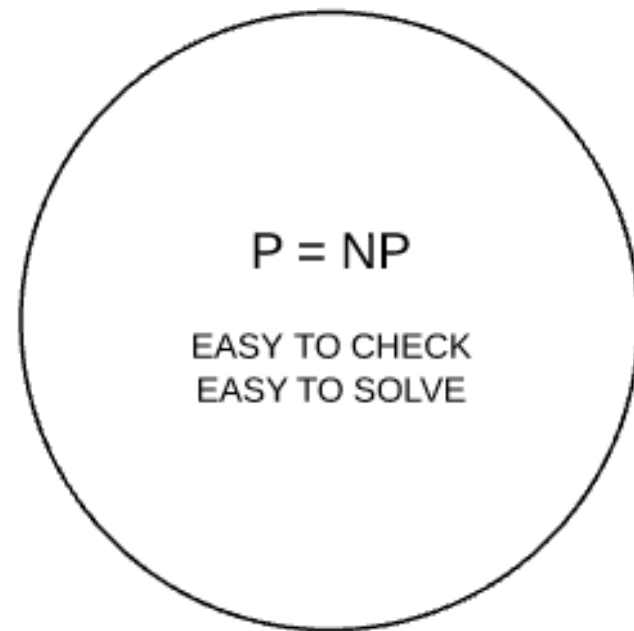
- * ... Let $p(n)$ be the number of steps to find a proof of length n . The question is, how rapidly does $p(n)$ grow for an optimal machine? It is possible to show that $p(n) > Kn$. If there really were a machine with $p(n) \sim Kn$ (or even just $\sim Kn^2$) then that would have consequences of the greatest significance. Namely, this would clearly mean that the thinking of a mathematician in the case of yes-or-no questions could be completely replaced by machine ...
 - Kurt Godel's letter to von Neumann in 1956 (15 years before P vs NP was formalized!)
- * "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."
 - Scott Aaronson

Pictorially

Believed: $P \neq NP$



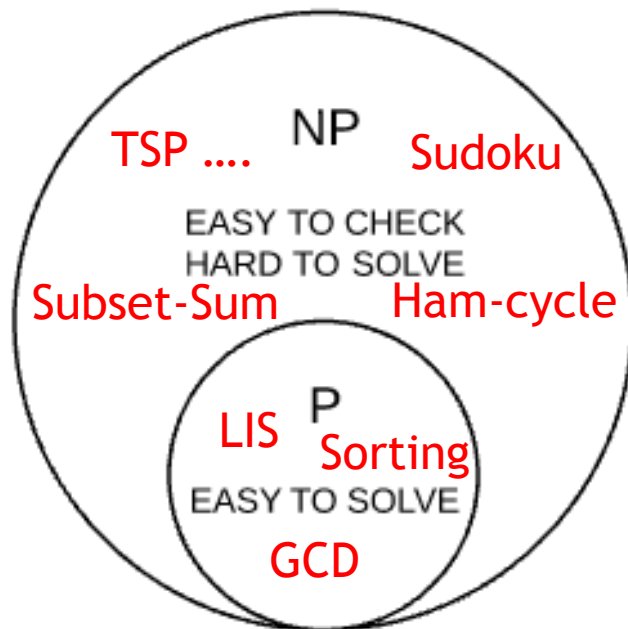
If $P = NP$



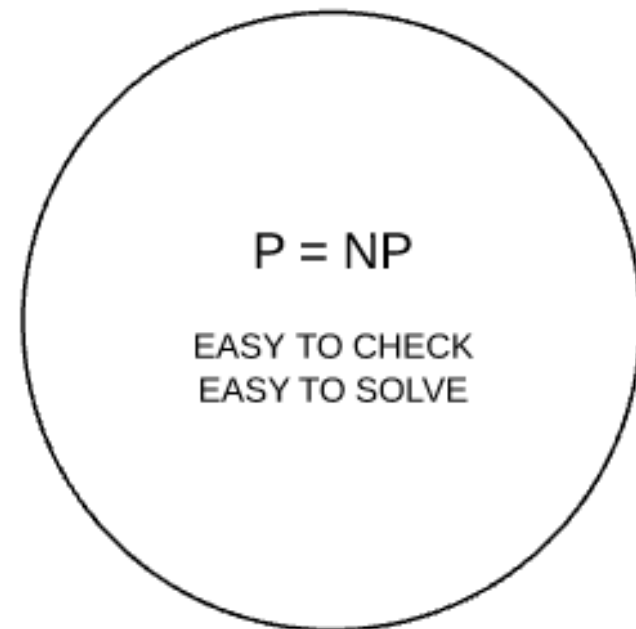
Pictorially

Problems beyond NP
(won't study here)

Believed: $P \neq NP$



If $P = NP$



Two Amazing Works (Given Turing Awards)

Cook-Levin (1971): SAT is “NP-hard.” In particular:
If **SAT** is in P, then **all of NP** is in P, i.e., $P=NP$.
(Easy: if SAT is not in P, then $P \neq NP$.)



So, to resolve P vs. NP, we “just” need to determine the status of SAT!

Karp (1972): TSP, Ham-Cycle, Subset Sum, ...
all of these are “**equivalent**” to SAT.



Either **all of them** are in P (so $P=NP$), or **none** are (so $P \neq NP$).

A “Hard” Language for NP

Cook-Levin Theorem:

Any poly-time algorithm for SAT

would yield, via efficient reduction,

a poly-time algorithm for *any* language in NP
(i.e., any efficiently verifiable language)

Satisfiability

- * Boolean *variables* x, y, z ... taking values true or false (1 or 0)
- * A Boolean *literal* is a variable or its negation $z, \neg z$
- * A Boolean *operator* is AND, OR (\wedge, \vee)
- * A Boolean *formula* is a formula involving Boolean literals and operators, e.g., $\phi = (\neg x \wedge y) \vee (x \wedge \neg z)$
- * A *satisfying assignment* for ϕ is a true/false assignment to the variables such that ϕ evaluates to true.
- * ϕ is *satisfiable* if it has a satisfying assignment
- * **SAT** = $\{\phi : \phi \text{ is a satisfiable Boolean formula}\}$

Satisfiability

- * **Ex 1:** $\phi(x,y) = \neg x \wedge y$
- * **Question:** What is $\phi(T,F)$ and $\phi(F,F)$?
- * **Ex 2:** $\phi(x,y,z) = (\neg x \vee y) \wedge (\neg x \vee z) \wedge (y \vee z) \wedge (x \vee \neg z)$
- * **Question:** Are these ϕ satisfiable?
- * **Question:** Is $\text{SAT} \in \text{NP}$?
I.e., is SAT efficiently verifiable?
Can the satisfiability of a given ϕ be efficiently verified?

Cook-Levin Outline

- * **Theorem [Cook-Levin]:** If $\text{SAT} \in \text{P}$, then $\text{NP} \subseteq \text{P}$.
- * Let D_{SAT} be an efficient decider for SAT.
- * Let $L \in \text{NP}$, so L has an efficient verifier V .
- * Goal: $L \in \text{P}$ via efficient decider D_L that uses D_{SAT} & V .
- * $D_L(x)$:
 - * **Cleverly construct** a poly-sized Boolean formula $\phi_{V,x}$ so that:
 - * $x \in L \iff \phi_{V,x}$ is satisfiable.
 - * Output $D_{\text{SAT}}(\phi_{V,x})$.

Initial Observations

- * $V(.,.)$ is an efficient verifier (i.e., a TM) for $L \in \text{NP}$.
- * For every input x and certificate c :
 - * V runs for at most $|x|^k$ steps, for some constant k .
 $\Rightarrow V$ can read/affect only the first $|x|^k$ tape cells
- * **Goal:** Given some x , design a Boolean formula $\phi_{V,x}$ that is satisfiable iff some c causes $V(x,c)$ to accept in at most $|x|^k$ steps.
- * **Solution:** Turing machine inspection!
- * **Definition:** A **configuration** of V represents V 's tape contents, state, head location.
- * **Example:** $011q_50001$ means:
 - * V 's tape has $0110001 \perp \perp \perp \dots$
 - * V is in state q_5 ; V 's head points to the 4th cell

A Configuration Tableau

- * A *tableau* is an array of symbols:
 - * Rows represent configurations (flanked by #s)
 - * Symbols can be from $S = \{0,1\} \cup Q \cup \{\#, \$, \perp\}$
 - * Successive rows correspond to configurations after each step of V

#	q_{st}	w_1	w_2	\dots	w_n	\perp	\dots	\perp	#
#									#
#									#
#									#

Initial configuration

After 1 step

V halts after at most n^k steps

Proof Overview

- * Given an input x , construct a Boolean formula $\phi_{V,x}$ that represents an **accepting V-tableau** with **input x** (and unspecified c):
- * $V(x, c)$ accepts for some $c \iff \phi_{V,x}$ is satisfiable.
- * Variables: $t_{i,j,s}$ denotes whether tableau cell (i,j) has symbol s .
- * $\phi_{V,x} = \phi_{\text{start}} \wedge \phi_{\text{cell}} \wedge \phi_{\text{accept}} \wedge \phi_{\text{step}}$
 1. ϕ_{start} enforces the starting config on input x (w/ unspecified c)
 2. ϕ_{cell} ensures that every cell contains exactly one symbol
 3. ϕ_{accept} ensures that V reaches an accepting configuration
 4. ϕ_{step} ensures that each configuration follows from the previous one according to the code of V

The Starting Configuration

ϕ_{start} enforces the starting configuration:

#	q_0	x	\$	c	\perp	\perp	#
---	-------	---	----	---	---------	---------	---

- * Initial state q_0 ,
- * Input x, $|x| = n$; certificate c, $|c| = n^k$
- * \$ - a special symbol (“comma”) that separates x and c
- * Certificate c is unspecified, so we leave a “placeholder”

$$\phi_{\text{start}} = t_{1,1,\#} \wedge t_{1,2,q_0} \wedge t_{1,3,x_1} \wedge t_{1,4,x_2} \wedge \dots \wedge t_{1,n+2,x_n} \wedge t_{1,n+3,\$} \wedge \dots$$

This fixes the first $n+3$ symbols

$$(t_{1,n+4,1} \vee t_{1,n+4,0} \vee t_{1,n+4,\perp}) \wedge (t_{1,n+5,1} \vee t_{1,n+5,0} \vee t_{1,n+5,\perp}) \wedge \dots$$

(c_1 can be either 1 or 0 or \perp)

Cell Consistency

* ϕ_{cell} ensures that every cell contains **exactly** one symbol:

every cell

cannot contain two different symbols

$$\bigwedge_{1 \leq i, j \leq n^k} \left[\bigvee_{\sigma \in S} t_{i,j,\sigma} \wedge \bigwedge_{\sigma \neq \tau \in S} \left(t_{i,j,\sigma} \wedge \bar{t}_{i,j,\tau} \right) \right]$$

contains at least one symbol

Accepting Configurations

ϕ_{accept} ensures that V reaches an accepting configuration:

$$\bigvee_{1 \leq i, j \leq n^k} t_{i, j, q_{\text{accept}}}$$

Computational Steps

ϕ_{step} ensures that each configuration follows from the previous configuration according to V 's transition function:

Definition: A 2x3 “window” is valid if it could appear in a valid tableau

Theorem: The whole tableau is valid if and only if every 2x3 window is valid.

The diagram shows a large square tableau of size $n^k \times n^k$. The top row is labeled with $\#$, q_{st} , w_1 , w_2 , \dots , w_n , \perp , \dots , \perp , and $\#$. The first and last columns are labeled with $\#$ at the top and bottom. A 2x3 window is highlighted in the center of the tableau, containing the following configuration:

?	?	?
?	?	?

Can write a small formula for window validity: e.g., $q_0 1 \rightarrow 1 q' 1$ if there is a $q \rightarrow q'$ transition ($0 \rightarrow 1, R$).

Conclusion

- * **Conclusion:** $P = NP$ iff there is an efficient algorithm for SAT (determining satisfiability of Boolean formulae)
- * **Common Belief:** There is no efficient algorithm for determining satisfiability, so $P \neq NP$.

