

# 6.5440: Algorithmic Lower Bounds / (6.5954) Fun with Hardness Proofs

"Hardness  
made Easy"

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<http://courses.csail.mit.edu/6.5440/fall23/>

## What is this class?

- practical guide to proving computational problems are formally hard / intractable
- NOT a complexity course  
(but we will use/refer to needed results)
- (anti)algorithmic perspective

## Why take this class?

- know your limits in algorithmic design
- master techniques for proving hardness
  - key problems
  - proof styles
  - gadgets
- cool connections between problems
- fun problems like Mario & Tetris (& serious problems)
- solve puzzles → publishable papers
- collaborative research / problem solving
  - past offerings have led to 33 papers & 8 theses so far!

Background: algorithms, asymptotics, combinatorics

- no complexity background needed  
(but also little overlap with a complexity class)

## Topics:

- NP-completeness (3SAT, 3-partition, Hamiltonicity, geometry)
- PSPACE, EXPTIME, ...
- Games, Puzzles, & Computation (Constraint Logic, Sudoku, Nintendo, Tetris, Rush Hour, Chess, Go, ...)
- 0, 1, 2 player/team games
- counting (#P) & uniqueness (ASP)
- undecidability & P-completeness (parallelism)
- inapproximability (PCP, APX, Set Cover, ind. set, UGC, ...)
- fixed-parameter intractability (W, clique, ...)
- optional: economic game theory (PPAD), 3SUM ( $n^2$  towards)

## Recommended texts:

→ free: hardness.mit.edu

- Computational Intractability [Demaine, Gasarch, Hajiaghayi 2024]
- Games, Puzzles, and Computation [Hearn & Demaine 2009]
- Garey & Johnson [1979] ↗ ebook from MIT Libraries

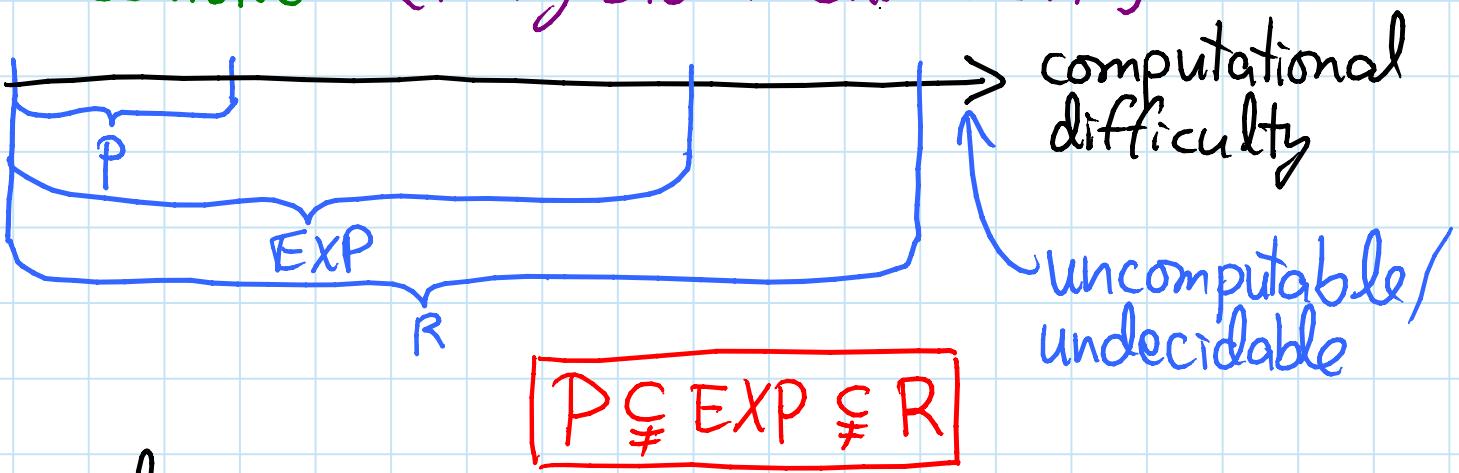
## Typical complexity of puzzles & games:

	0 players	1 player	2 players	2 teams + hidden info.
bounded (poly.)	P	NP	PSPACE	NEXPTIME
unbounded (exp.)	PSPACE	PSPACE	EXPTIME	R / undecidable

# Intro to complexity: CRASH COURSE

P = {problems solvable in polynomial time}  $\xrightarrow{N^c}$   
EXP = {problems solvable in exponential time}  $\xrightarrow{2^{N^c}}$

R = {problems solvable in finite time}  
↳ "recursive" [Turing 1936; Church 1941]



## Examples:

- negative-weight cycle detection  $\in P$
- n × n Chess  $\in EXP$  but  $\notin P$ 
  - ↳ who wins from given board config.?
- Tetris  $\in EXP$  but don't know whether  $\in P$ 
  - ↳ survive given pieces from given board
- halting problem  $\notin R$ 
  - ↳ does this code ever finish?
- "most" decision problems  $\notin R$ 
  - (# algorithms  $\approx N$ ; # dec. problems  $\approx 2^N = R$ )

→ answer ∈ {YES, NO}

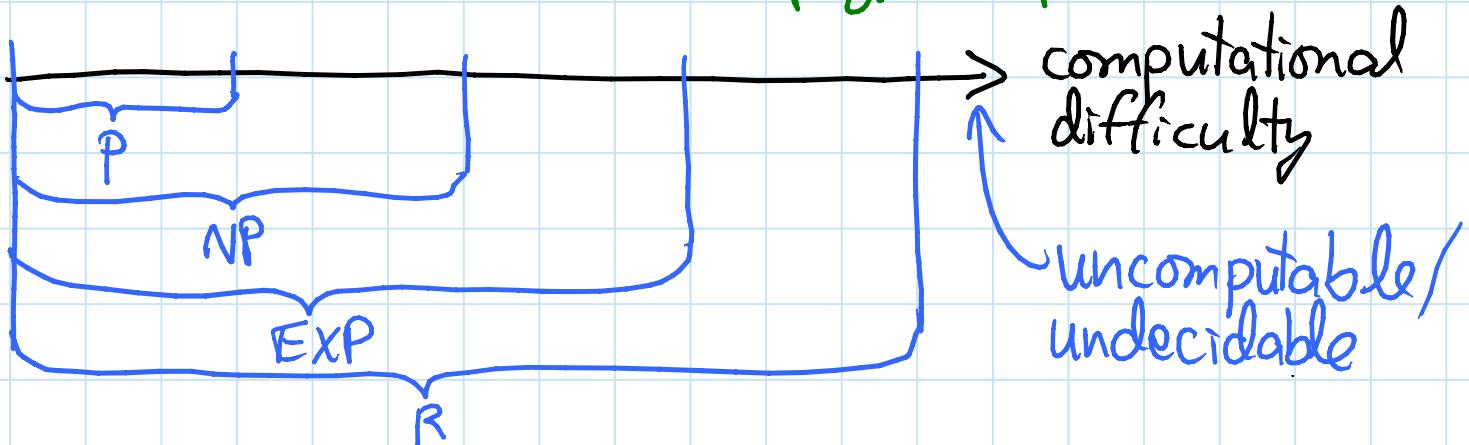
NP = {decision problems solvable in poly. time via a "lucky" algorithm}

↳ can make lucky guesses, always "right", without trying all options

- nondeterministic model: algorithm makes guesses & then says YES or NO
- guesses guaranteed to lead to YES outcome if possible (NO otherwise)

= {decision problems with solutions that can be "checked" in polynomial time}

- when answer = YES, can "prove" it & poly.-time algorithm can check proof  
⇒ poly.-size proof



Example: Tetris ∈ NP

- nondeterministic alg:
  - guess each move
  - did I survive?
- proof of YES: list what moves to make (rules of Tetris are easy)

P ≠ NP: big conjecture (worth \$1,000,000)

≈ can't engineer luck

≈ generating (proofs of) solutions can be harder than checking them

CoNP = negations ( $\text{YES} \leftrightarrow \text{No}$ ) of problems  $\in \text{NP}$   
= problems with good proofs of No answer

→ NP, EXP, etc.

→ defined later

X-hard = "as hard as" every problem  $\in X$

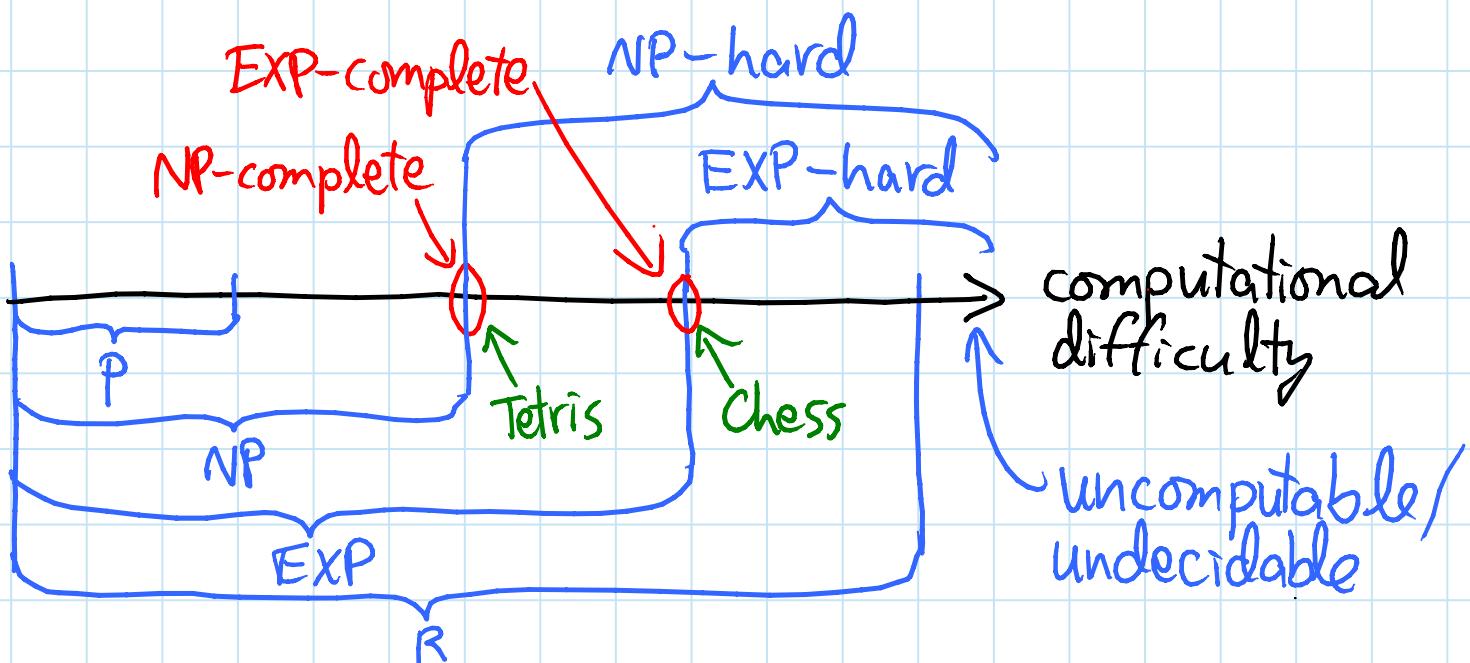
X-complete = X-hard  $\cap X$

sometimes "X-easy" =  $\in X$

e.g. Tetris is NP-complete [L3]

[Brenkelaar, Demaine, Hohenberger, Hoogeboom, Kosters, Liben-Nowell  
2004]

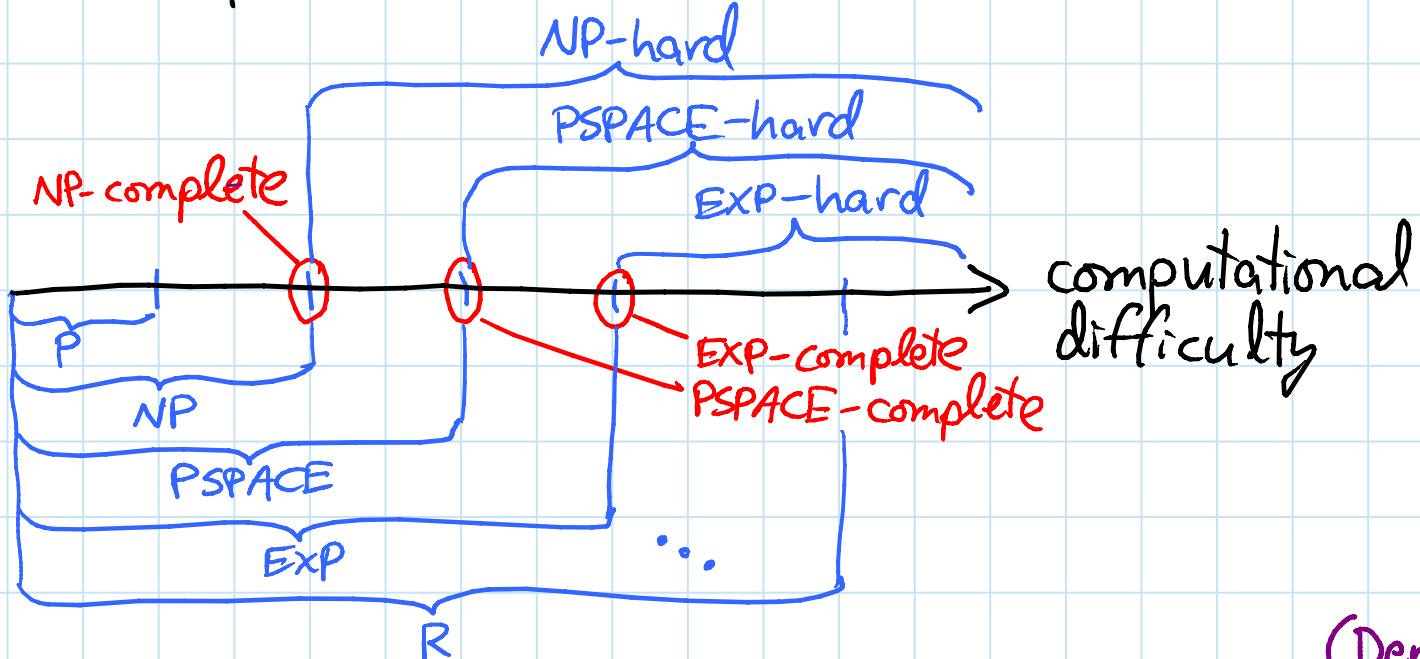
⇒ if  $P \neq NP$ , then Tetris  $\in NP \setminus P$



e.g. Chess is EXP-complete  $\Rightarrow \notin P$

$\Rightarrow \text{Chess} \in \text{EXP} \setminus \text{NP}$  if  $NP \neq EXP$  (also open)

- PSPACE = {problems solvable in polynomial space}
- $\subseteq \text{EXP}$ : only exponentially many states
  - $\supseteq \text{NP}$ : simulate all executions, take running OR
  - open whether either is strict



e.g. Super Mario Bros. is PSPACE-complete  
 $\Rightarrow \notin P$  if  $P \neq NP$  or  $NP \neq PSPACE$

{ Demaine,  
 Viglietta,  
 Williams  
 2016  
 [L10]

Beyond exponential: (not too important)

$$\text{EXP(TIME)} \subseteq \text{EXPSPACE} \subseteq \underbrace{2\text{EXP(TIME)}}_{\text{double exponential: } 2^{2^n}} \subseteq 2\text{EXPSPACE} \subseteq \dots$$

Also  $L = \text{LOGSPACE} \rightarrow O(\lg n)$  bits of space!

$$\text{EXP} \subsetneq 2\text{EXP} \subsetneq \dots \leftarrow \text{time \& space hierarchy theorems}$$

$$L \subsetneq \text{PSPACE} \subsetneq \text{EXPSPACE} \subsetneq 2\text{EXPSPACE} \subsetneq \dots \leftarrow$$

Nondeterministic:

- $\text{NPSPACE} = \text{PSPACE}$  [Savitch 1970] e.g. Mario  $\in \text{NPSPACE} = \text{PSPACE}$
- $\text{NEXP}, \text{N}2\text{EXP}, \dots$ : analogs of  $NP$

→ in general, space bound squares

What does "as hard as" mean?

Poly. size ("blowup")

Reduction from A to B = poly-time algorithm to  
convert: instance of A  $\rightarrow$  instance of B

such that solution to A = solution to B  
 $\Rightarrow$  if can solve B then can solve A

B ∈ P  
B ∈ NP  
⋮

A ∈ P  
A ∈ NP  
⋮

$\Rightarrow$  B is at least as hard as A  
(A is a special case of B)

if  $A \rightarrow B$  then  
A is X-hard  
B is  $\downarrow$   
B is X-hard

- this is a "one-call" reduction [Karp]
- "multi-call" reduction [Turing] also possible:  
solve A using an oracle that solves B
- doesn't help much for problems we consider

Examples from algorithms:

- unweighted shortest paths  $\rightarrow$  weighted ( $w=1$ )
- min-product path  $\rightarrow$  min-sum path (lg)
- longest path  $\rightarrow$  shortest path (negate)
- min-weight k-step path  $\rightarrow$  min-weight path  
(k copies of graph + links between adj. layers)

Almost all hardness proofs are by reduction  
from known hard problem to your problem

Exponential Time Hypothesis: (ETH) [Impagliazzo & Paturi - CCC 1999]

no  $2^{o(n)}$ -time algorithm for 3SAT

↳ formula size or # variables (see L20)

- concrete  $P \neq NP$  conjecture relating to EXPTIME

- if reduction from 3SAT  $\rightarrow$  problem B

of size blowup  $n^c$

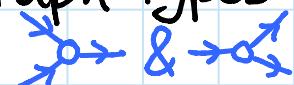
then ETH  $\Rightarrow$  no  $2^{o(n^{1/c})}$ -time alg. for B

Example source problem:

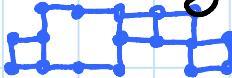
Hamiltonicity: (from L9)

- path/cycle is Hamiltonian if it visits every vertex exactly once

- NP-complete to decide whether there's a Hamiltonian path in following graph types:

① 3-regular directed graphs 

② grid graph



- vertices  $V \subseteq \mathbb{Z}^2$  (grid points)

- edge  $(u,v) \Leftrightarrow \text{distance}(u,v) = 1$

- ETH  $\Rightarrow$  no  $2^{o(|V|)}$ -time algorithm for ①  
& no  $2^{o(\sqrt{|V|})}$ -time algorithm for ②  
& these are tight

[L20]

## Examples of hardness proofs:

100% speedrunning video games: [≈Forišek - FUN 2010] ↗ see L8

- collecting all  $n$  objects in a maze environment (possibly with specified start and/or finish) in the minimum possible time is NP-complete
- proof: reduction from Hamiltonicity ②
  - grid graph  $\rightarrow$  maze (edge  $\rightarrow$  corridor, vertex  $\rightarrow$  branch)
  - target time =  $n \cdot \text{vertex time} + (n-1) \cdot \text{edge time}$   
(need to be consistent)
- linear blowup assuming  $O(1)$ -size vertex/edge gadgets  
 $\Rightarrow 2^{O(\sqrt{n})}$  time impossible assuming ETH

Applications: NP-hard to 100% speedrun:

- Mario (collecting all coins or red coins)

Applications: NP-hard to speedrun:

- Zelda 2 dungeons (collect all keys, doors@end) & every Zelda game with "small keys"
- Metroidvania & most Zelda games & RPGs (collect all powerups, need all at end)

Applications: NP-hard to win

- Katamari Damacy (collecting all objects within the time limit)

## Examples of hardness proofs:

### The Witness:

- squares of 2 colors + broken edges
  - ↳  $\leq 1$  color per region of path
- $k$ -triangles + broken edges
  - ↳  $k$  incident edges in path
- edge hexagons (no broken edges)
  - ↳ must be visited by path
- 3-triangles (no broken edges)

## Requirements: (taking for credit)

- watch all video lectures  
( $2 \times 1.5 \text{ hr/week / speed}$ )
  - attend class (MW 3-4:30+):
  - participate in problem solving
  - above all REQUIRED: must do most lectures & classes
  - problem sets, weekly
  - project
- 20% REQUIRED**
- 40% REQUIRED**
- 50% OPTIONAL**
- 50% OPTIONAL**
- TOTAL: 160%**

## Measurement:

[completion  $\geq$  80%]

on Coauthor

- attendance sheet

- progress reports

- guest lectures

Coauthor  $\geq 1$

post on Coauthor by next SUNDAY

- solved problems (pset puzzles)

- open problems (research!)

- coding problems (implement/visualize reductions)

- collaborate!

- Gradescope

- code, write-up, present

## Grading Scheme:

- lowest-scoring component's weight reduced until  $\sum$  weights = 100%.

$\Rightarrow$  can skip project OR problem sets OR do both to make up for lost points

- this decides your letter grade (A, B, ...); we may use other schemes for +/-

Coauthor: master record of notes, ideas, progress

- anything worth saving should end up here.
  - e.g. post photos of useful whiteboards
- can use asynchronously too (between meetings)
  - CoCreate is a useful digital whiteboard

<https://cocreate.csail.mit.edu>

- questions thread, including completion ↗
- Solved problems:
  - your posts are private (to avoid spoiling) to your coauthors (& us)
  - we may publish your answers to class
- open problems & research are SECRET:  
do not share outside this class!
- add whoever you're working with as Coauthors

GitHub: for coding problems & paper/project writing

- feel free to create PRIVATE repos.  
*(get permission before making public)*
- link from relevant Coauthor thread

Office hours: this Friday @ 3pm  
or by appointment