

TODAY: Computational Complexity

- P, EXP, R - pseudopoly.
- most problems are uncomputable
- NP
- hardness & completeness
- reductions

Recall: $\Theta(nt)$ -time algorithm for Subset Sum

(given n pos. integers $A = \{a_0, a_1, \dots, a_{n-1}\}$ & target sum t , does any subset $S \subseteq A$ sum to t)

- is this fast?
- cf. obvious $\Theta(2^n n)$ -time brute force alg.

Polynomial time = polynomial in input size

- here $\Theta(n)$ if number t fits in a word
- $\Theta(n \lg t)$ in general (can assume $a_i \leq t$)
- t is exponential in $\lg t$ (not polynomial)

Pseudopolynomial time = polynomial in
the problem size AND the numbers in input
here: t & a_i 's

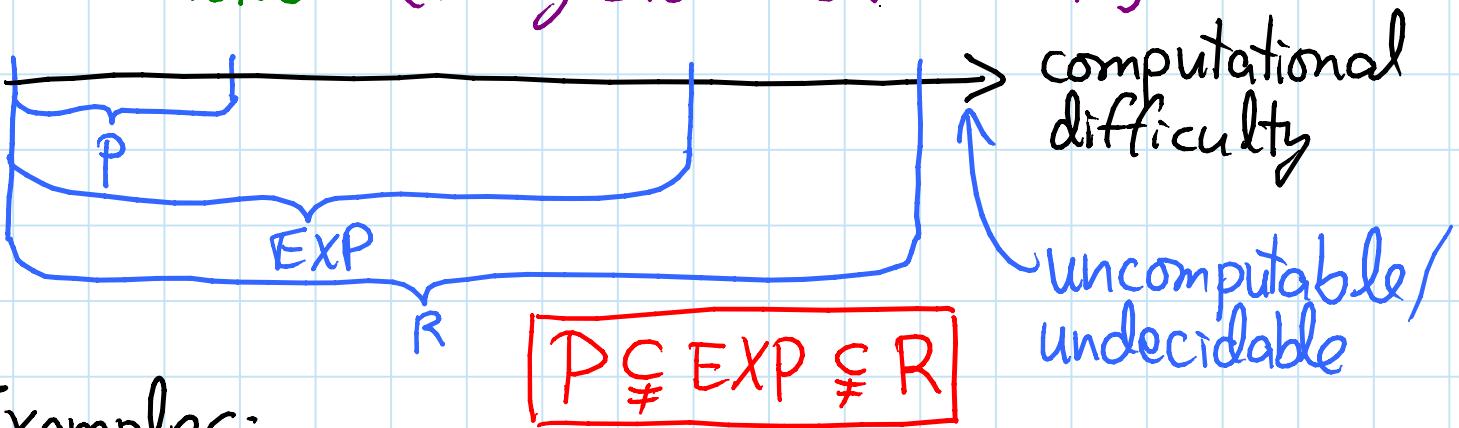
- $\Theta(nt)$ is pseudopolynomial

Polynomial: GOOD; Exponential: BAD; Pseudopoly: ^{so} GOOD

P = {problems solvable in polynomial time}
 $n^{O(1)}$ time where $n = \text{INPUT SIZE} \leftrightarrow$
(what this class is all about)

EXP = {problems solvable in exponential time}
 $2^{n^{O(1)}}$

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



Examples:

- negative-weight cycle detection $\in P$
- $n \times n$ 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: given a computer program, does it ever halt (stop)?

- uncomputable ($\notin \mathbb{R}$): no algorithm solves it (correctly in finite time on all inputs)
- decision problem: answer is YES or NO

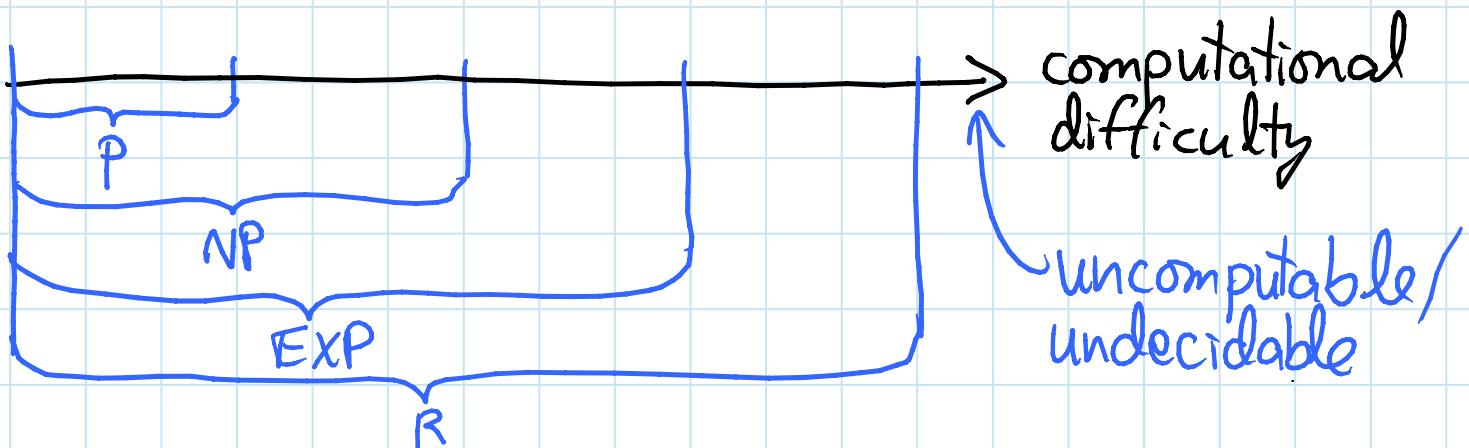
Most decision problems are uncomputable:

- program \approx binary string \approx nonneg. integer $\in \mathbb{N}$
- decision problem = a function from binary strings to $\{\text{YES, NO}\}$
 - \approx nonneg. integers
 - $\approx \{0, 1\}$
- \approx infinite sequence of bits \approx real number $\in \mathbb{R}$
- $|N| < |R|$: no assignment of unique nonneg. integers to real numbers (R uncountable)
(proof by "diagonalization" argument [6.042])
- \Rightarrow not nearly enough programs for all problems
 - each program solves only one problem
- \Rightarrow almost all problems cannot be solved

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

Scan 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 with a polynomial-length proof/certificate checkable in poly. time



Example: Tetris \in NP

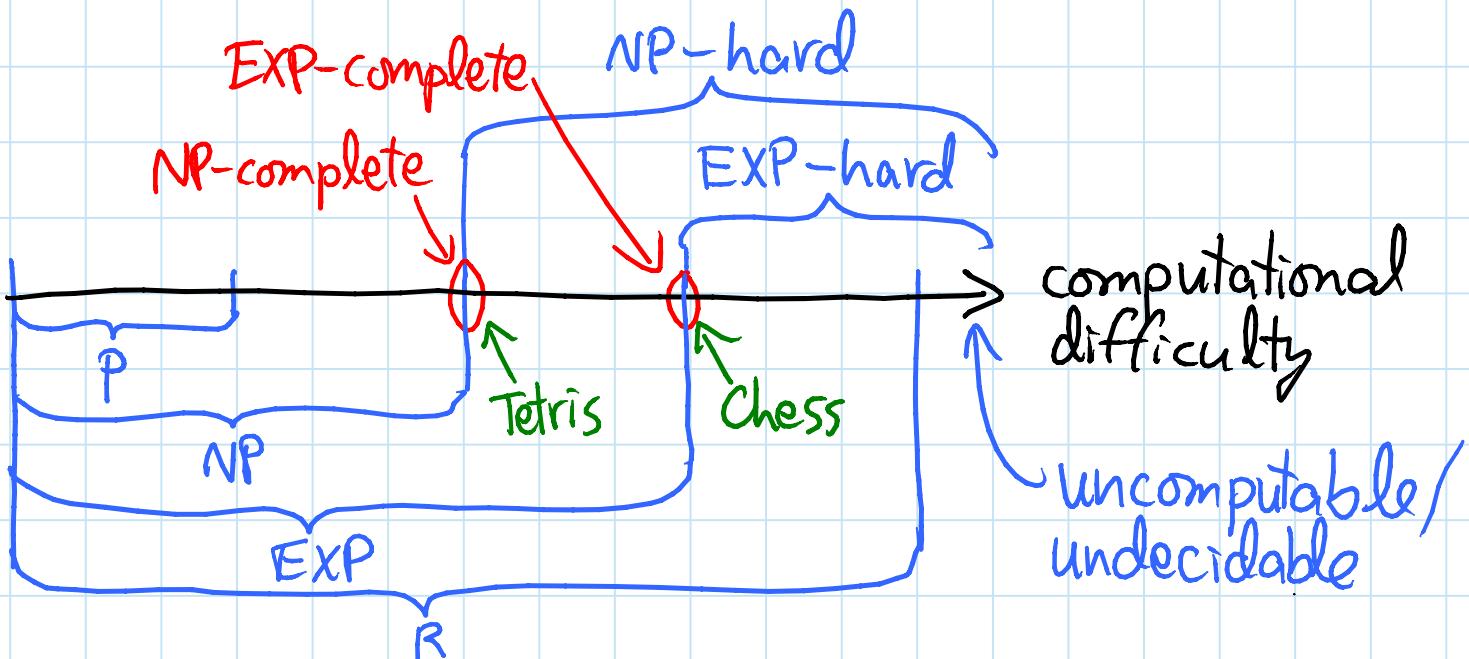
- nondeterministic alg:
 - guess each move
 - did I survive?
- proof of YES: list what moves to make
(rules of Tetris are easy)

P \neq NP: big conjecture (worth \$1,000,000)
 \approx can't engineer luck
 \approx generating (proofs of) solutions is sometimes harder than checking them

Claim: if $P \neq NP$, then Tetris $\in NP \setminus P$

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

Why? Tetris is NP-hard
 = "as hard as" every problem $\in NP$
 — in fact NP-complete = $NP \cap NP\text{-hard}$



Similarly: Chess is EXP-complete
 = $EXP \cap EXP\text{-hard}$

as hard as every problem in EXP

\Rightarrow if $NP \neq EXP$, then Chess $\notin EXP \setminus NP$
 also open, but less famous/"important"

Reductions: convert your problem into a problem you already know how to solve
(instead of solving from scratch)

- most common algorithm design technique
- unweighted shortest path \rightarrow weighted
set weights = 1
- integer-weighted shortest path \rightarrow unweighted
subdivide edges
- longest path \rightarrow shortest path
negate weights
- $\leq k$ -dangerous path \rightarrow graph reachability
k copies of the graph [PSG-5]

A \rightarrow B reduction:

A problem \rightarrow B problem

A solution \leftarrow B solution

\Rightarrow A is at least as easy as B

i.e. B is at least as hard as A

- NP-complete problems are all interreducible using polynomial-time reductions (same difficulty)
- \Rightarrow can use reductions to prove NP-hardness
e.g. 3-Partition \rightarrow Tetris

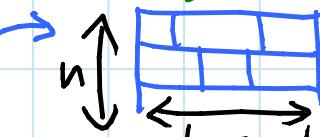
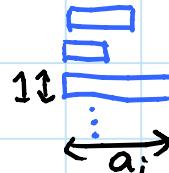
Examples of NP-complete problems:

- Subset Sum (pseudopoly, not poly) "weakly NP-complete"
- 3-Partition: given n integers, can you divide them into triples of equal sum? "strongly NP-complete"

REDUCTION

(not even pseudopoly. possible if $P \neq NP$)

→ rectangle packing

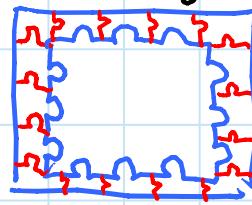
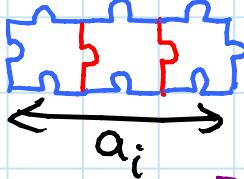


target sum

→ jigsaw puzzles

ambiguous

unique



[Demaine & Demaine 2007]

- Minesweeper, Sudoku, & most puzzles
- Super Mario Bros., Legend of Zelda, Pokémon, ...

[Aloupis, Demaine, Guo 2012]

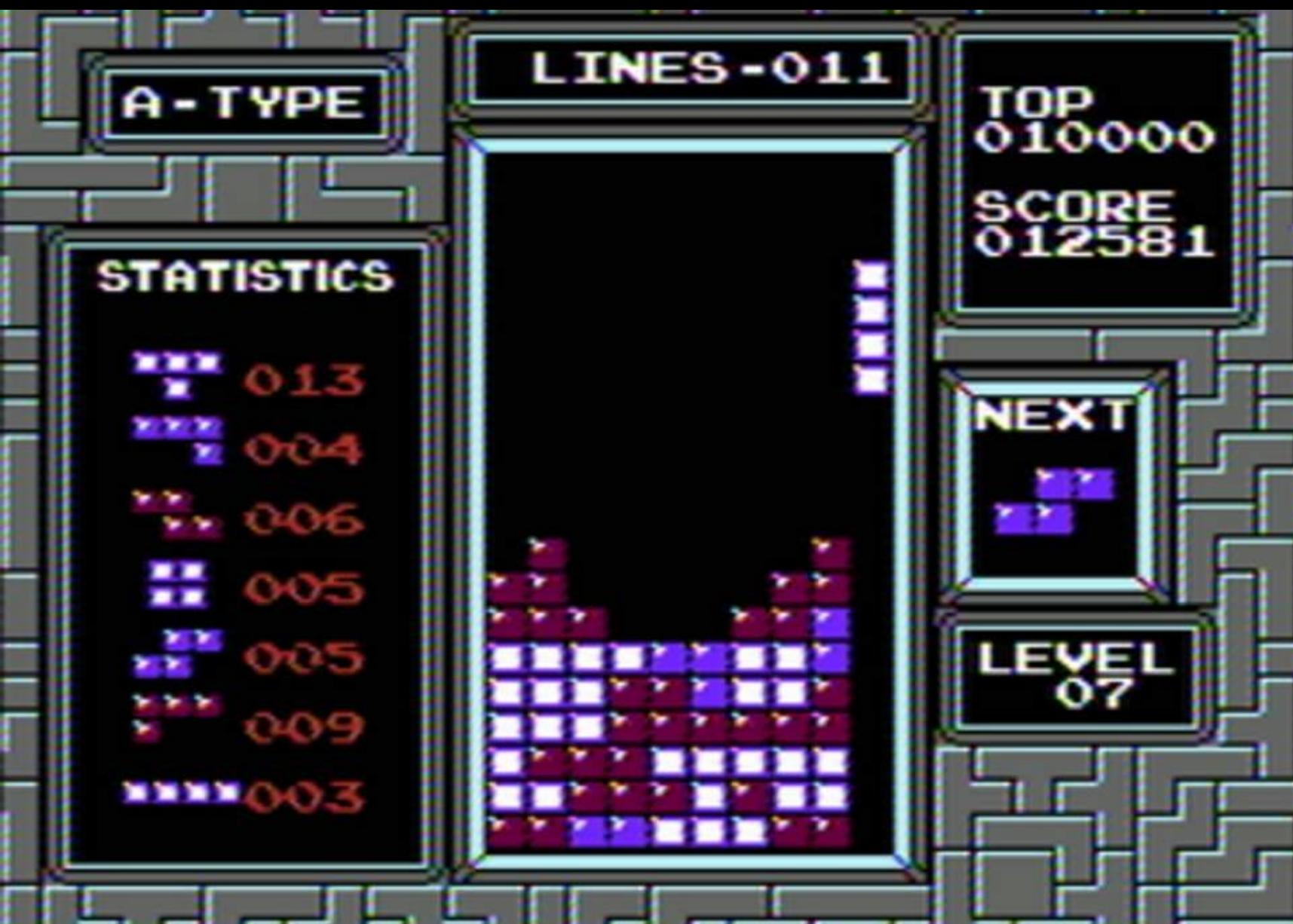
- longest simple path in a graph
→ deciding whether you've already won in Settler's of Catan is NP-complete!
- Traveling Salesman Problem: shortest path that visits all vertices of a given graph
 - decision version: is min weight $\leq x$?
- longest common subsequence of k strings
- SAT: given a Boolean formula (and, or, not), is it ever true?
 x and not $x \rightarrow \text{NO}$
- shortest paths amidst obstacles in 3D
- 3-coloring a given graph
- find largest clique in a given graph



“Horses Running Endlessly”
by Gabriel Orozco, 1995

[http://www.museoamparo.com/collections/
piece/2534/horses-running-endlessly](http://www.museoamparo.com/collections/piece/2534/horses-running-endlessly)

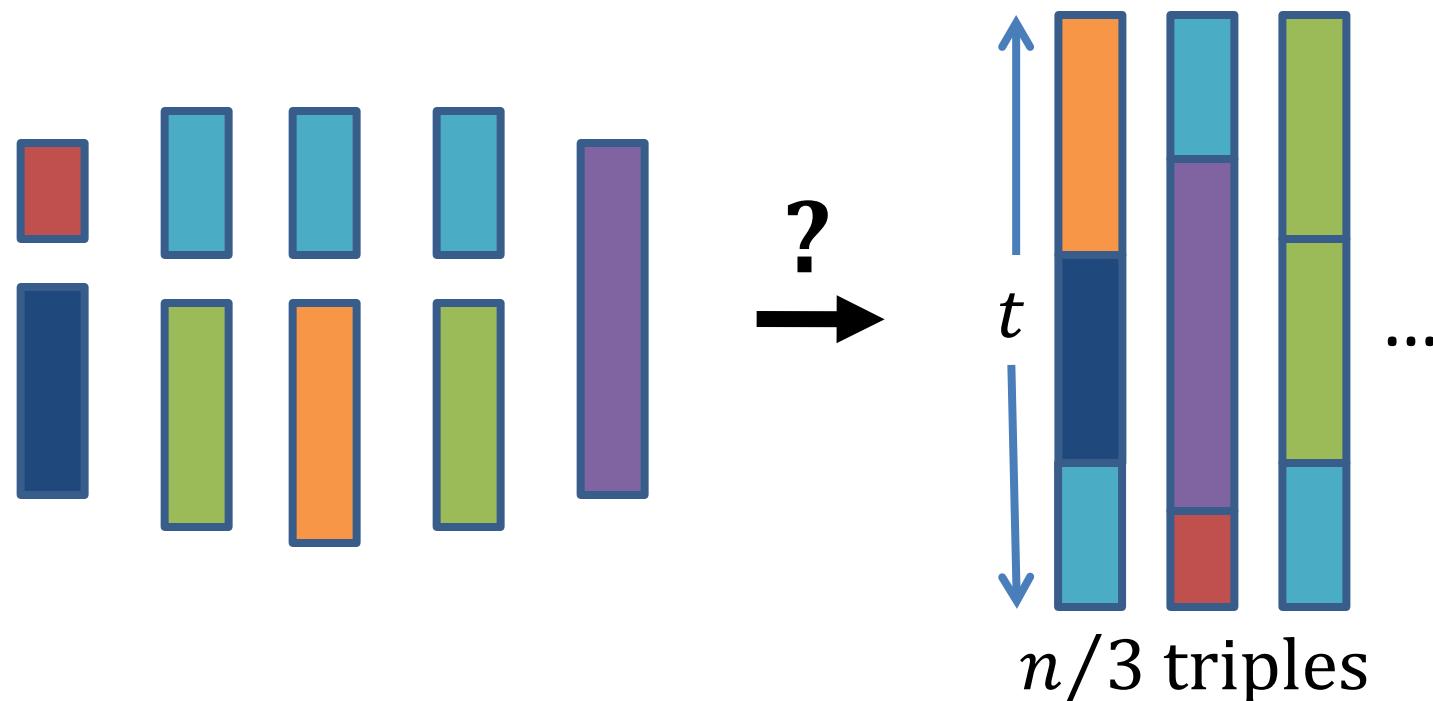
MIT Green Bldg.
April 2012



Classic NP-complete Problem: 3-Partition

[Garey & Johnson 1975]

- Given n integers a_1, a_2, \dots, a_n between 0 and n , can you partition them into $n/3$ triples with the same sum? $\left[t = \frac{(\sum_i a_i)}{n/3} \right]$

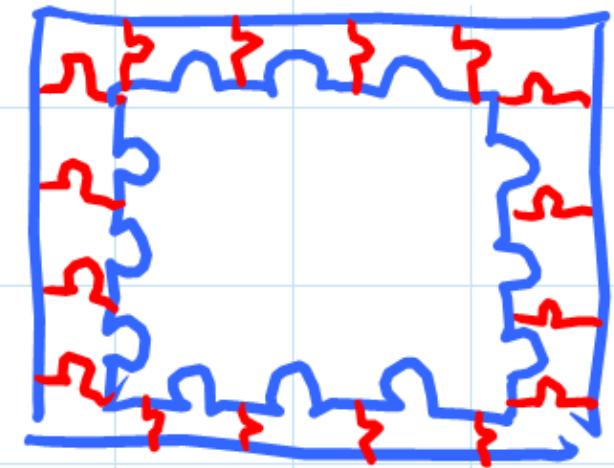
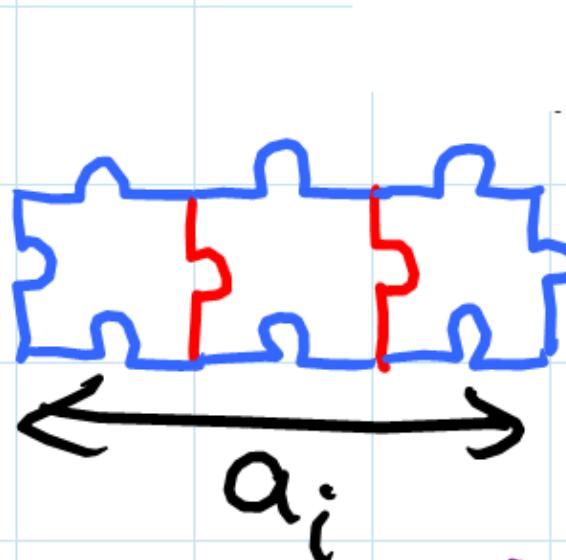


Reduction from 3-Partition to Jigsaw Puzzles

[Demaine & Demaine 2007]

- Given n integers a_1, a_2, \dots, a_n between 0 and n , can you partition them into $n/3$ triples with the same sum? $\left[t = \frac{(\sum_i a_i)}{n/3} \right]$

jigsaw puzzles
ambiguous
unique

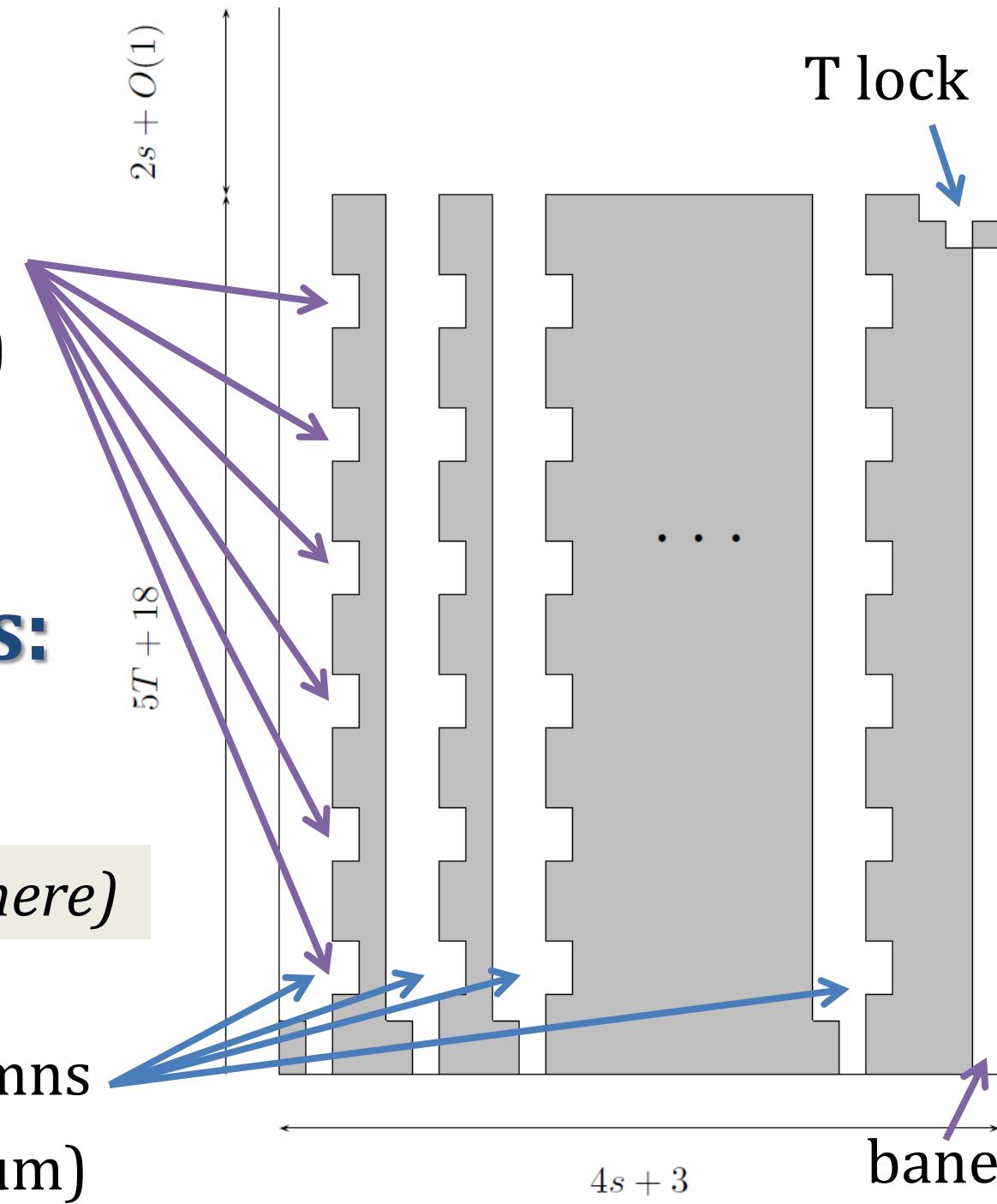


Reduction from 3-Partition to Tetris: Initial Board

(it is possible to actually get here)

$s = \frac{n}{3}$ columns
(one per sum)

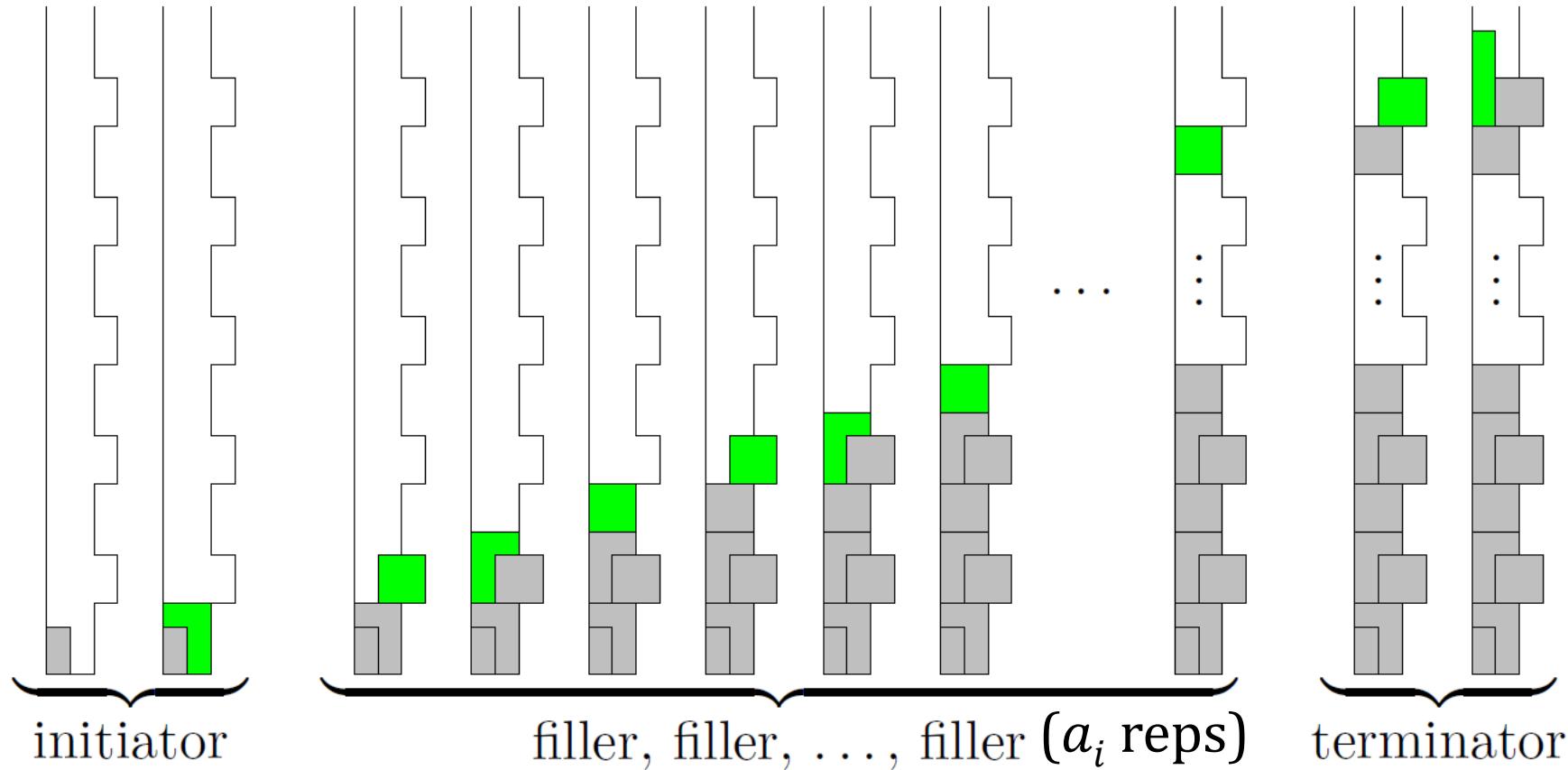
$\approx t$ notches
(target sum)



Reduction from 3-Partition to Tetris: Piece Sequence

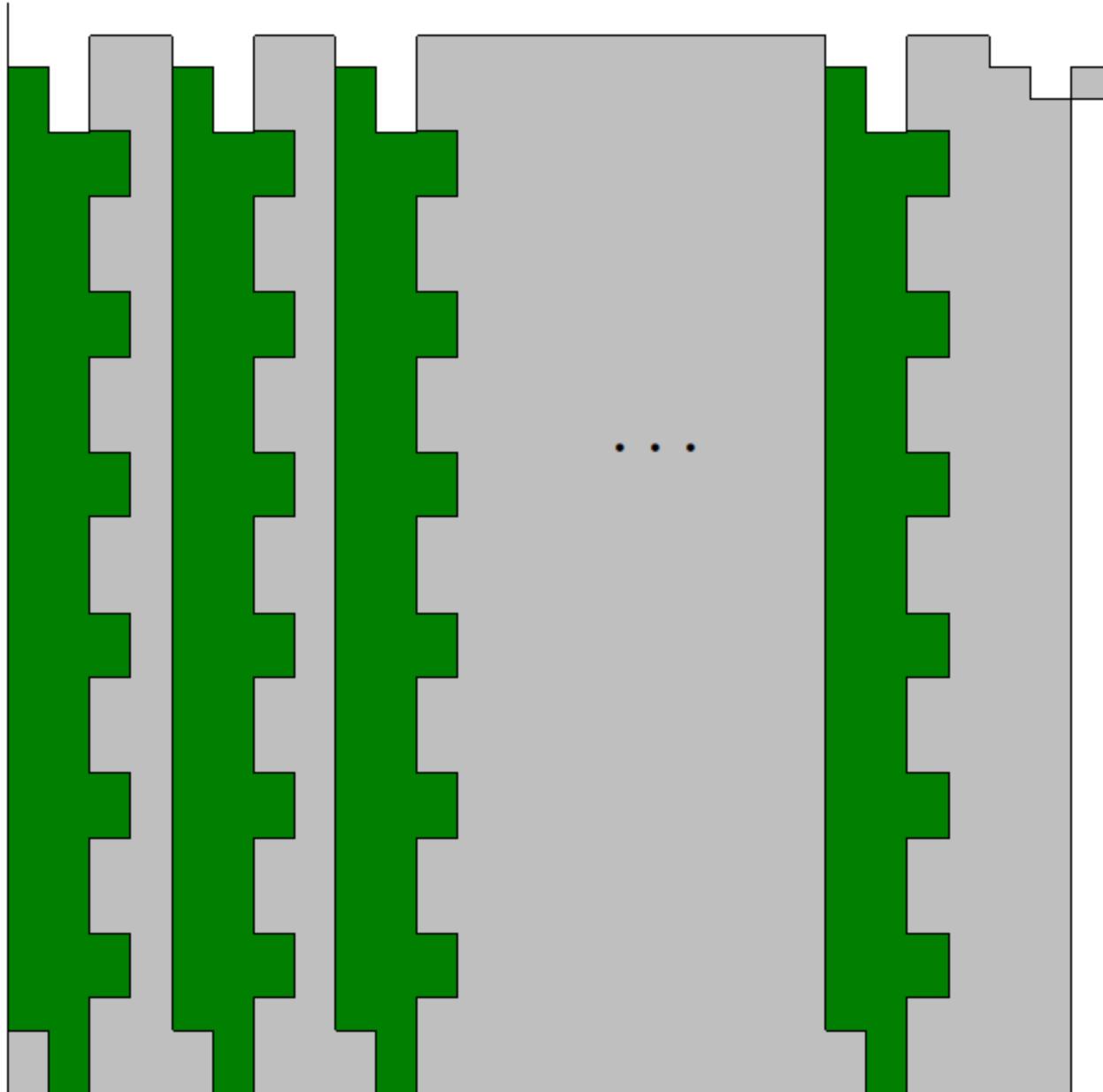
[Breukelaar, Demaine, Hohenberger,
Hoogeboom, Kosters, Liben-Nowell 2003]

- For each input a_i :



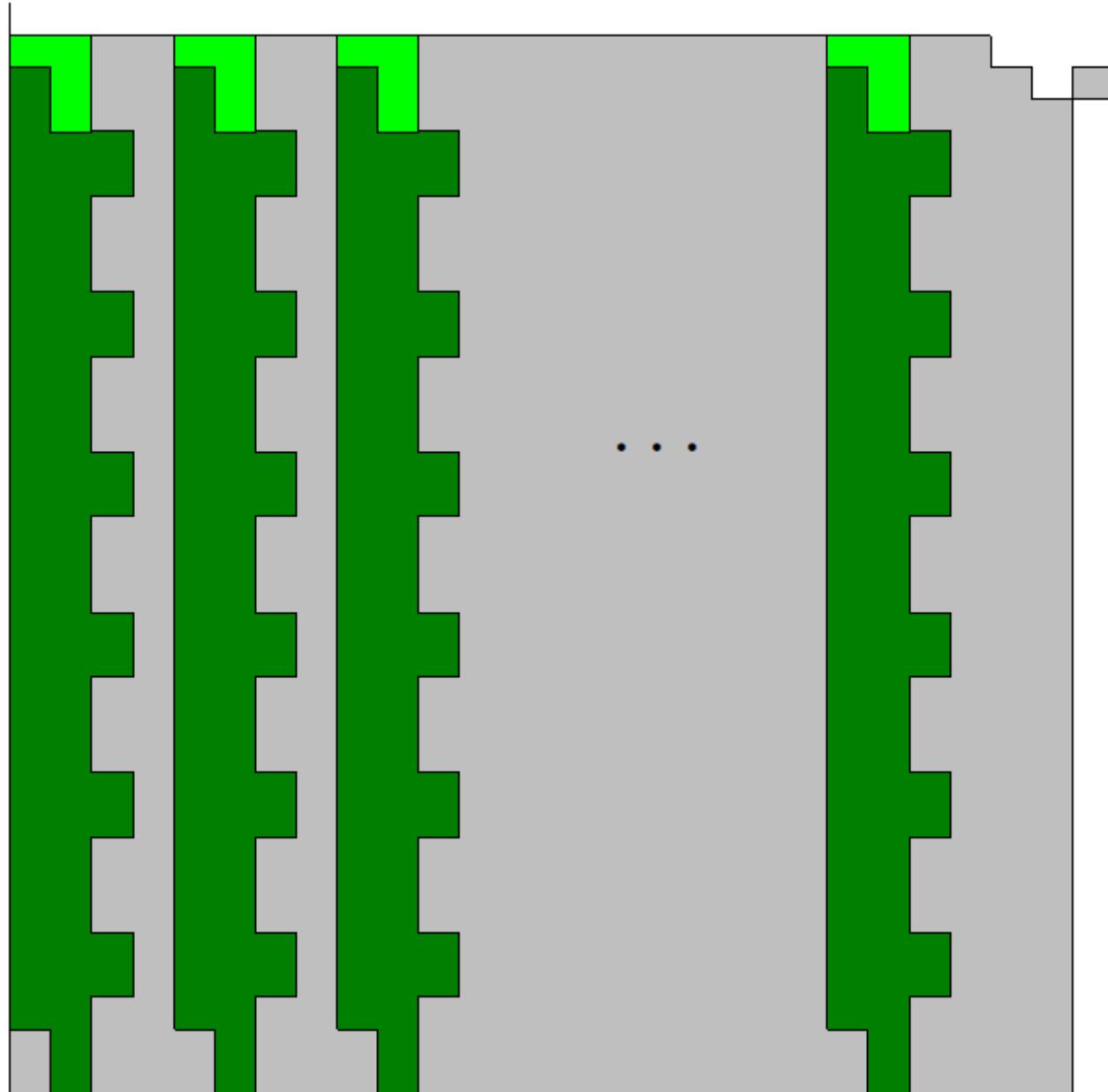
Finale Pieces

[Breukelaar,
Demaine,
Hohenberger,
Hoogeboom,
Kosters,
Liben-Nowell
2003]



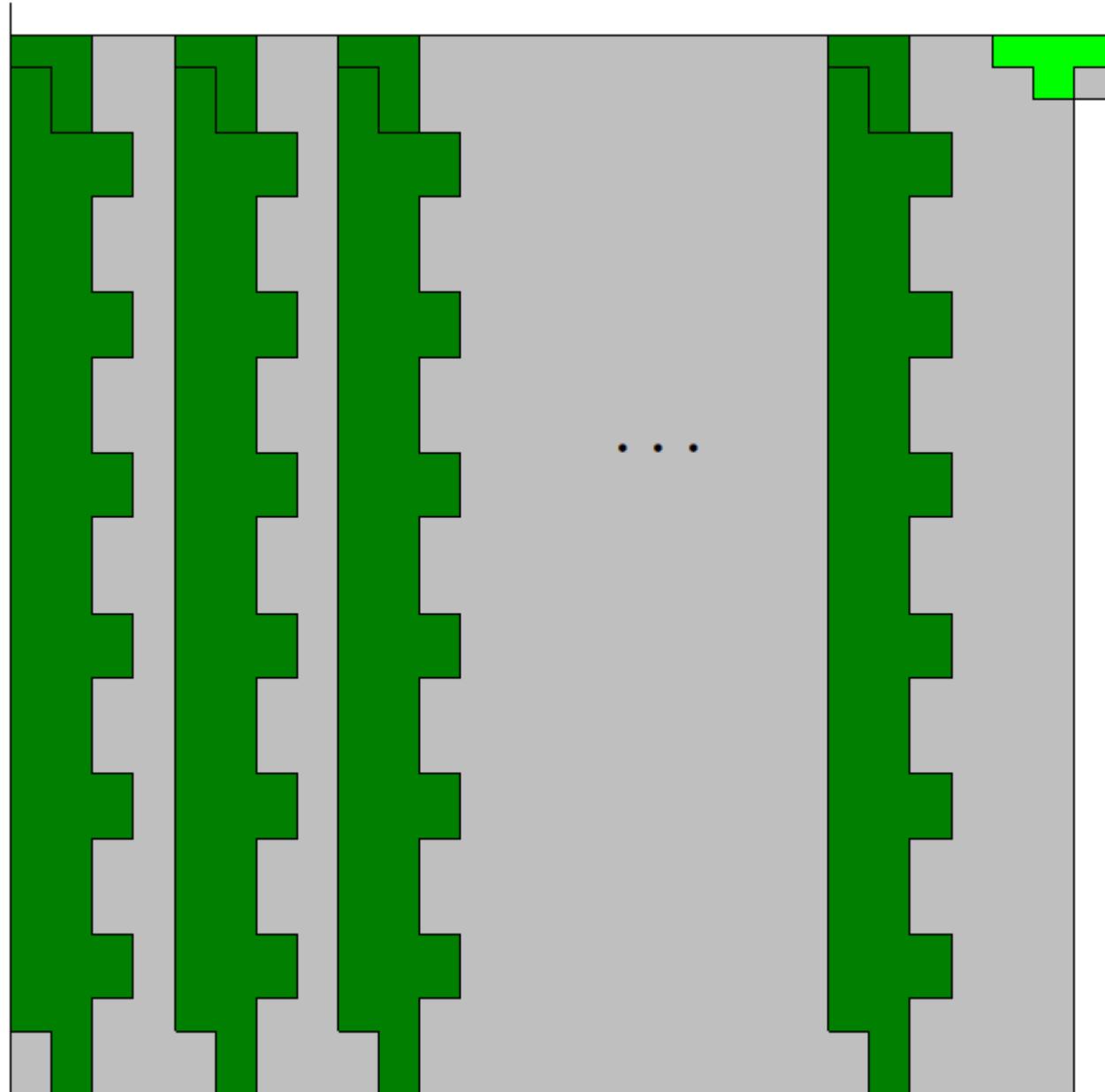
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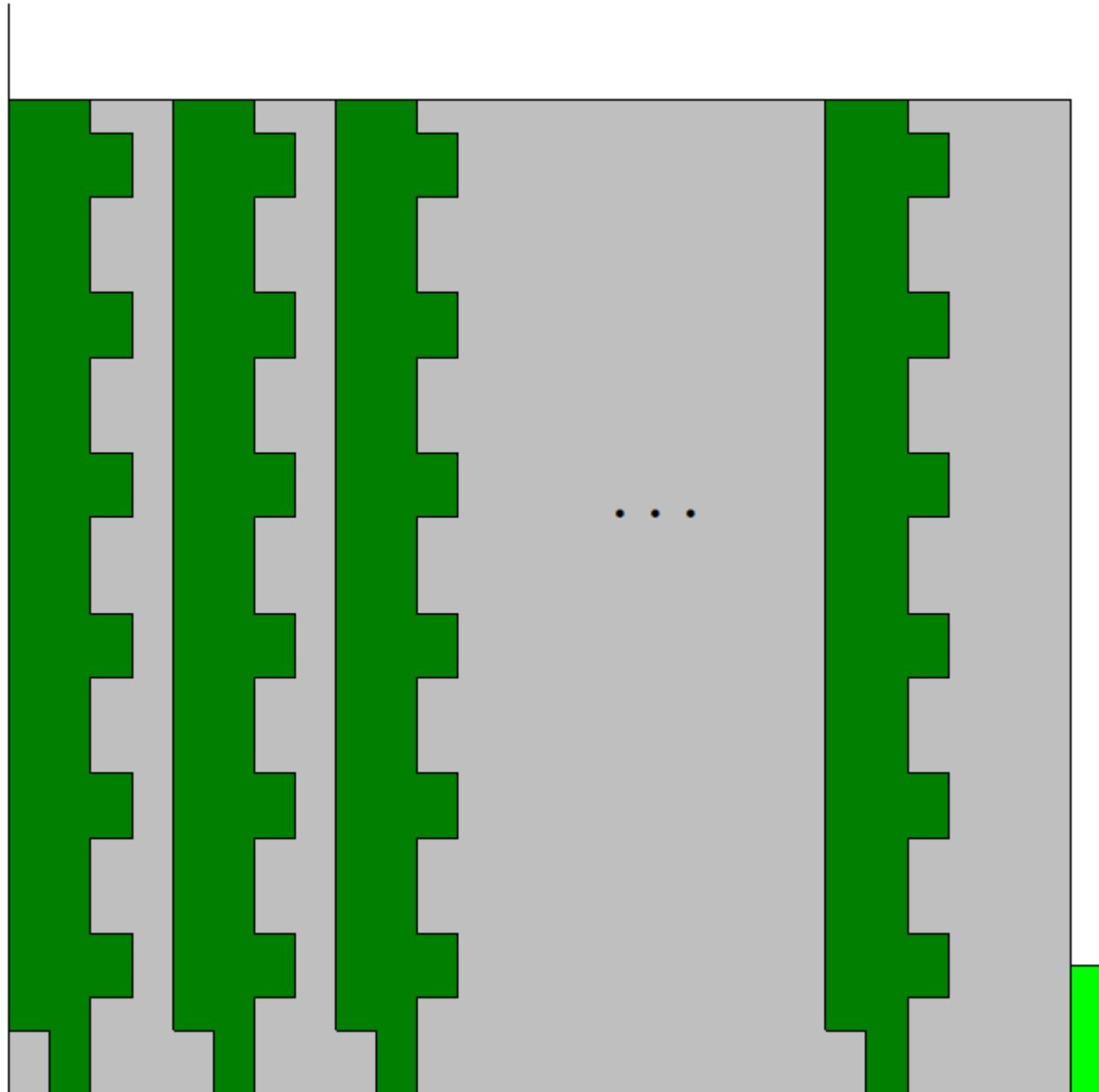
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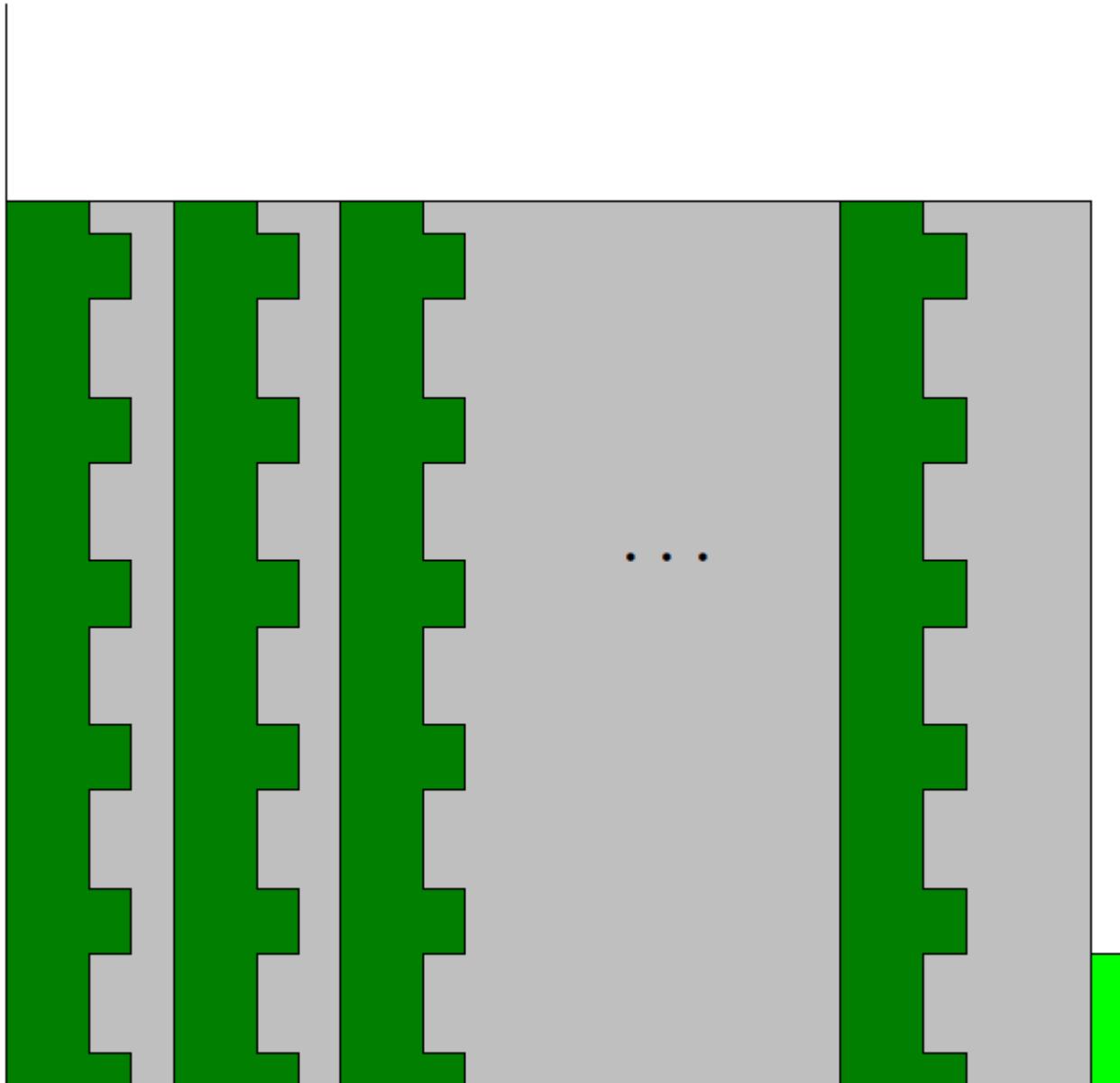
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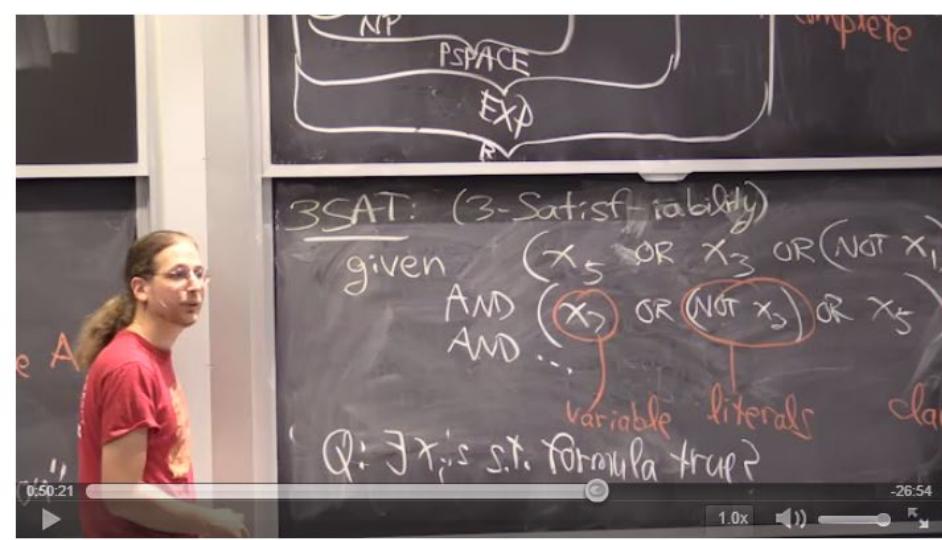
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Finale Pieces

[Breukelaar,
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Download Video: [360p](#), [720p](#)

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Video times: • 47:27–50:56

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KOTAKU TOP STORIES

Classic Nintendo Games are (NP-)Hard

Greg Aloupis* Erik D. Demaine† Alan Guo‡
March 26, 2012

TOTAL RECALL Mon. - Fri. 11PM - Mid. EASTERN

NINTENDO

Science Proves Old Video Games Were Super Hard

BY LUKE PLUNKETT MAR 12, 2012 11:00 PM Share +1 Like 411 33,867 232

RETURNING SPRING 2019!

Handwritten notes, page 8/8 • [\[previous p\]](#)
Video times: • 47:27–

Examples of hardness proofs:

① Super Mario Bros. is

- reduction from 3SAT: (make true) a formula
 $(x_1 \text{ OR } x_3 \text{ OR } (\text{NOT } x_5))$
AND $(x_5 \text{ OR } (\text{NOT } x_7) \text{ OR } x_7)$
AND ...
3 lite

② Rush Hour is PSPACE-co

- reduction from NCL: given directed graph w/ find sequence of edge reverse a target edge, maintaining total in-w
- only need AND vertex

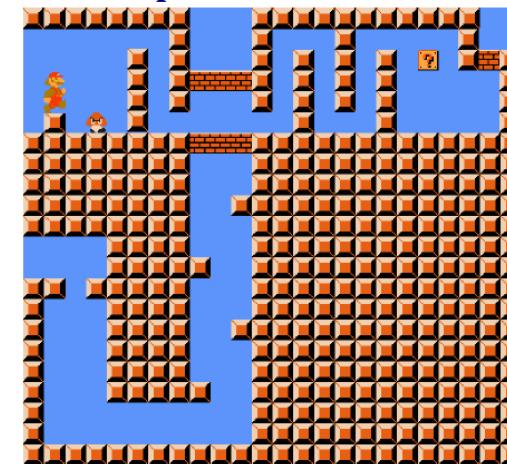
(in fact: OR can be input active)

- Constraint Logic is a proving hardness of

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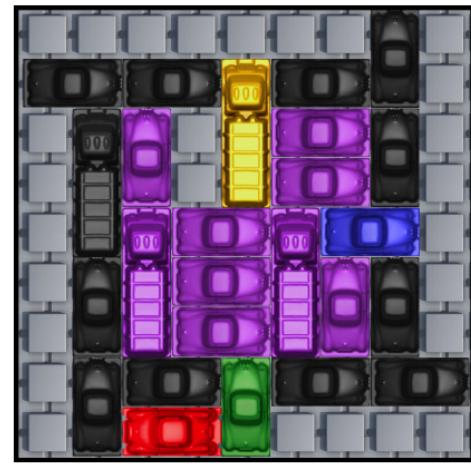
ALGORITHMIC LOWER BOUNDS: FUN WITH HARDNESS PROOFS

Super Mario Bros.



Crossover gadget for NP-hardness

Rush Hour



AND gadget for PSPACE-hardness

Minesweeper



OR gadget for NP-hardness

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