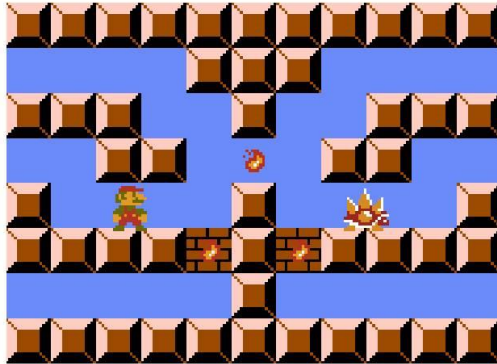


# Algorithmic Lower Bounds: Fun with Hardness Proofs

## Super Mario Bros.

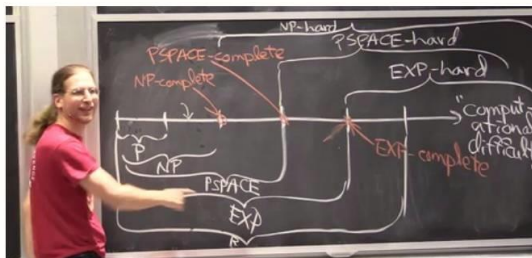


Door gadget for PSPACE-hardness

## Minesweeper



OR gadget for NP-hardness



**6.5440** (register for **6.S954**)  
taught by Professor Erik Demaine  
featuring *supercollaborative* problem solving

## Hardness Made Easy\*

Learn **when to give up** the search for efficient algorithms; see **connections** between computational problems; **solve puzzles** to prove theorems, solve **open problems**, and write papers.

Topics: NP, PSPACE, EXPTIME, EXPSPACE, approximation, fixed parameter, counting, games & puzzles, key problems, gadgets, and proof styles.



**Mondays & Wednesdays 3:00-4:30pm**  
Room 32-082

<https://courses.csail.mit.edu/6.5440/fall23/>  
sign up for our mailing list to join the class  
AUS (CS Theory Track), AAGS (Theoretical CS Concentration)

**Fall 2023**

\*Easiness not guaranteed. Side effects such as open problems and a heightened sense of complexity may occur. Ask your advisor if 6.5440 is right for you!

# Computers and Intractability: A Guide to Algorithmic Lower Bounds

by [Erik D. Demaine](#), [William Gasarch](#), and  
[Mohammad Hajiaghayi](#)

MIT Press, 2024

## Book Draft

[View Book Draft \(PDF\)](#)

*Last updated: Thursday, August 25, 2022*

This is a **draft** of the book. There will be typos, missing references, rough/missing figures, and other mistakes. Please help us find them!

Send comments and suggestions for improvements to [hardness-book@mit.edu](mailto:hardness-book@mit.edu).

<https://hardness.mit.edu/>

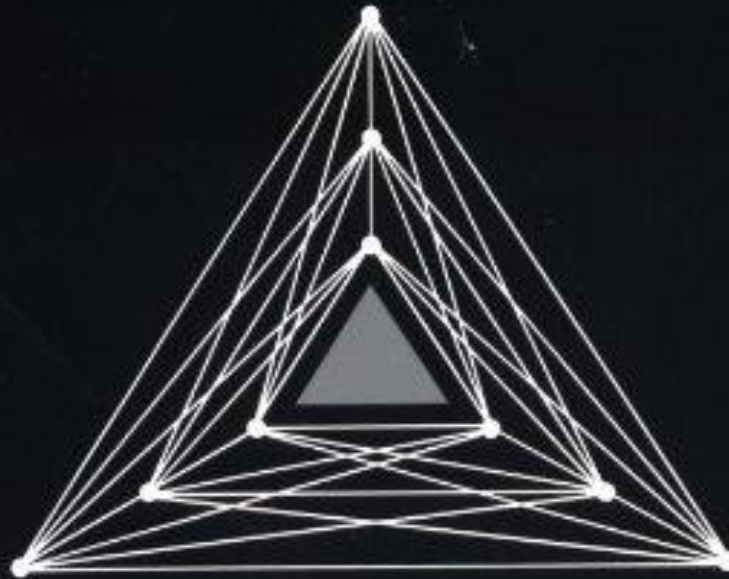
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# COMPUTERS AND INTRACTABILITY

## A Guide to the Theory of NP-Completeness

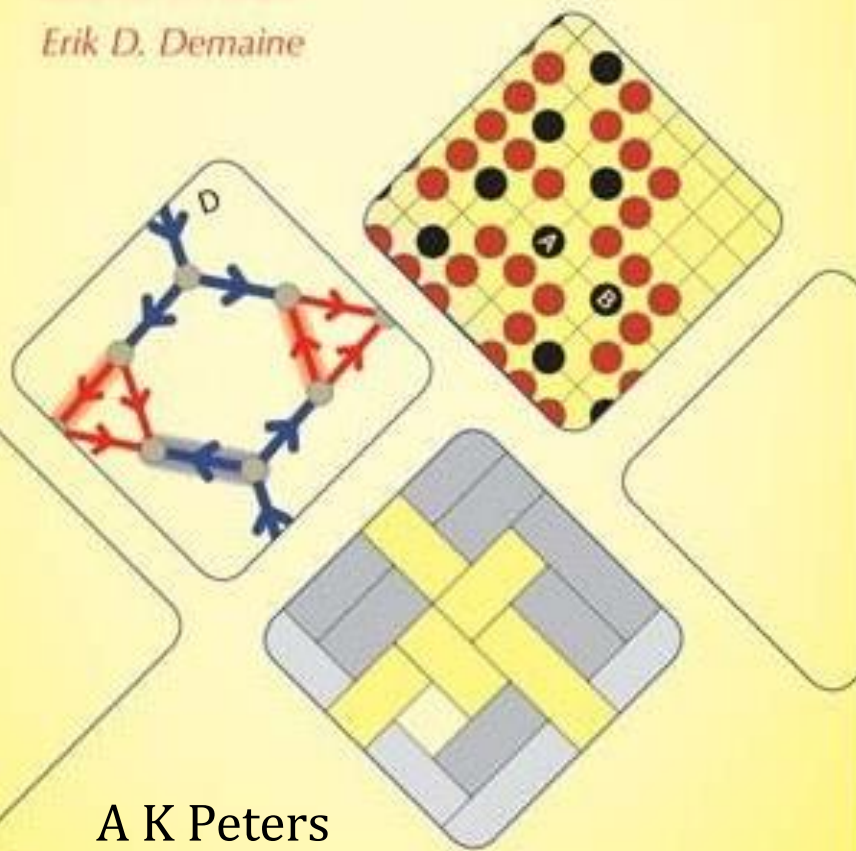
Michael R. Garey / David S. Johnson



W. H. Freeman  
1979

# Games, Puzzles, & Computation

Robert A. Hearn  
Erik D. Demaine



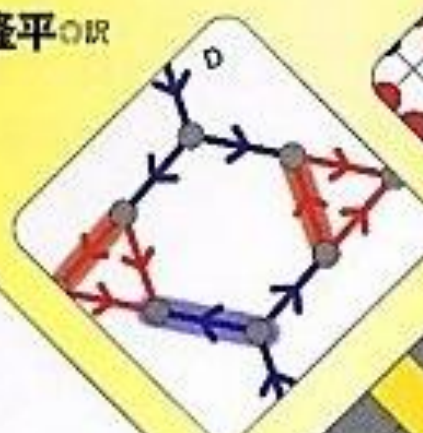
A K Peters  
July 2009

# ゲームと パズルの 計算量

Games, Puzzles,  
& Computation

Robert A. Hearn  
Erik D. Demaine

ロバート・A・ハーン  
エリック・D・ドメイン 著  
上原隆平 訳

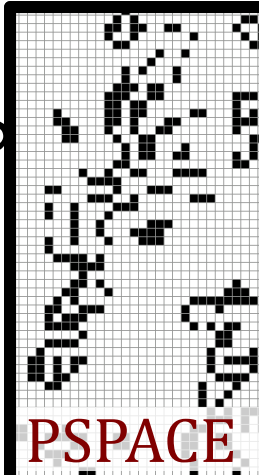


translated by  
Ryuhei Uehara

近代科学社

# Complexity of Games & Puzzles

unbounded



PSPACE



PSPACE



EXPTIME



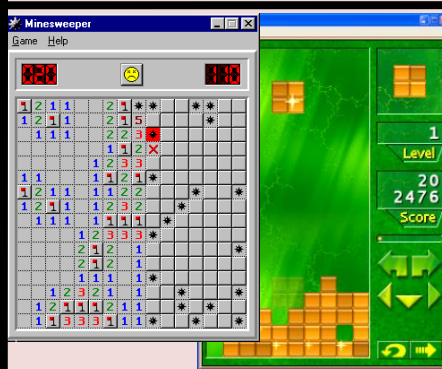
Rengo Kriegspiel?

Undecidable

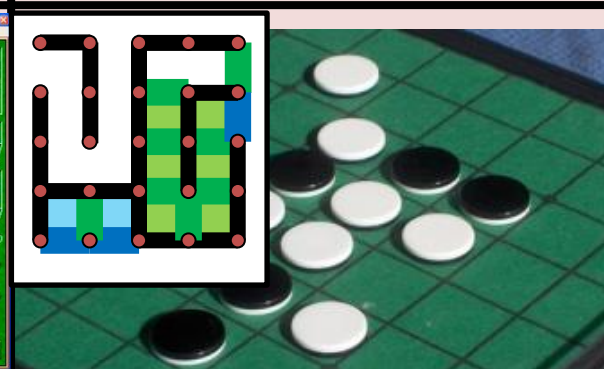
bounded



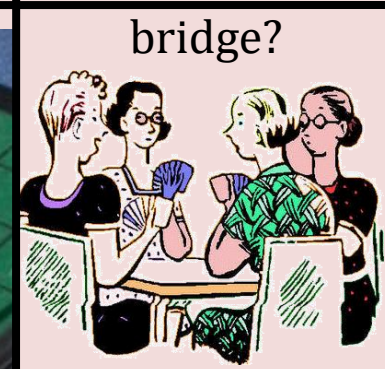
P



NP



PSPACE



bridge?

NEXPTIME

0 players  
(simulation)

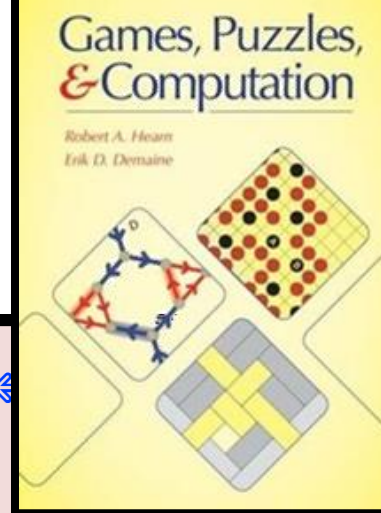
1 player  
(puzzle)

2 players  
(game)

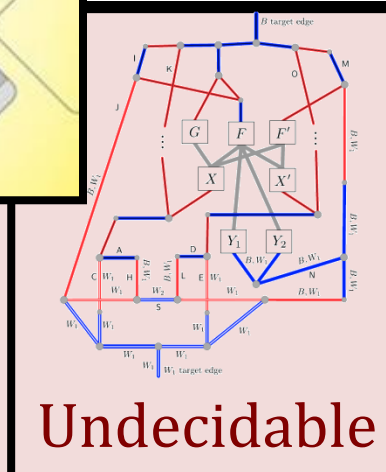
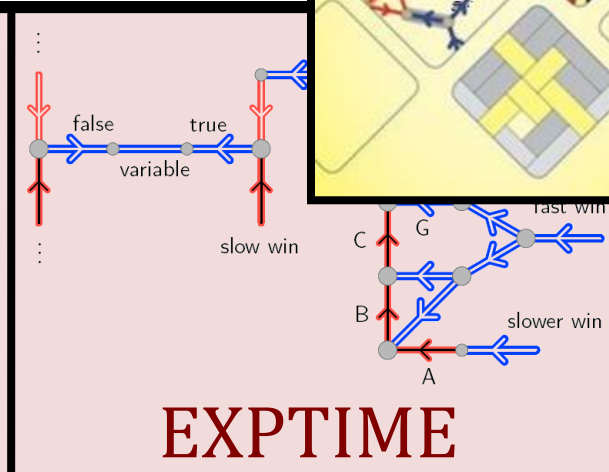
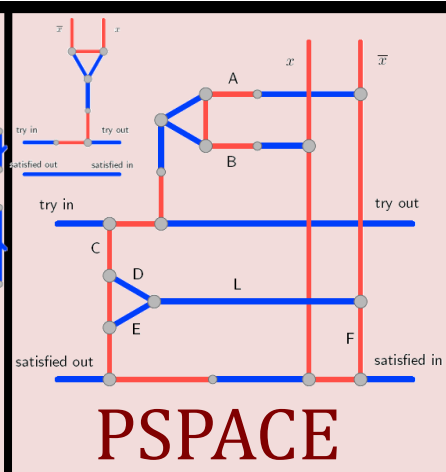
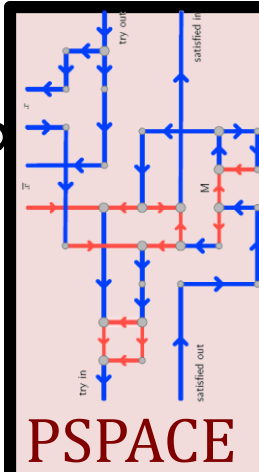
team,  
imperfect info

# Constraint Logic

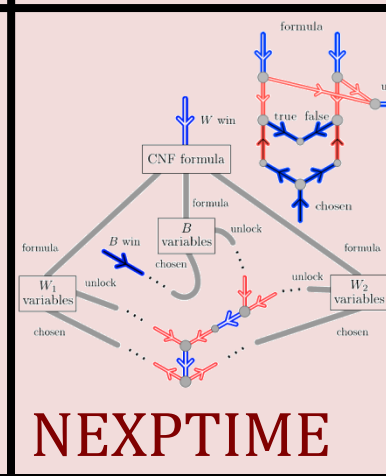
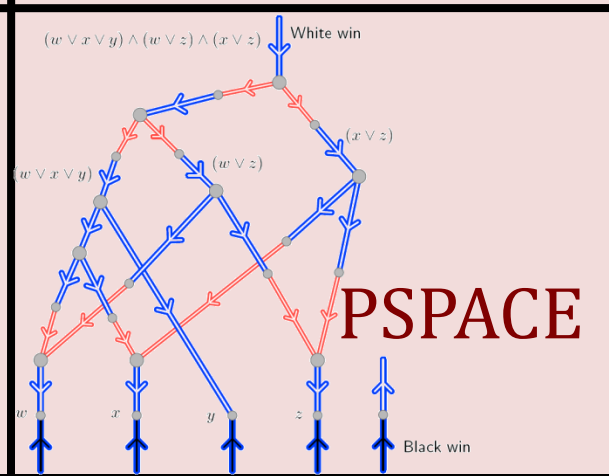
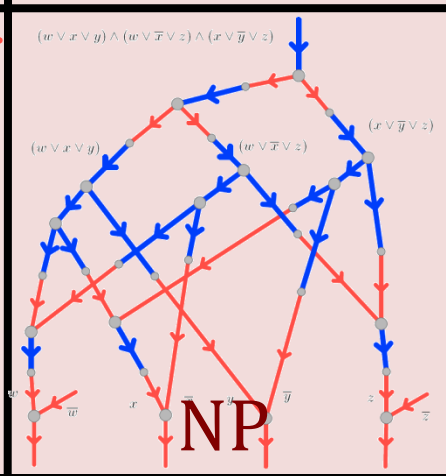
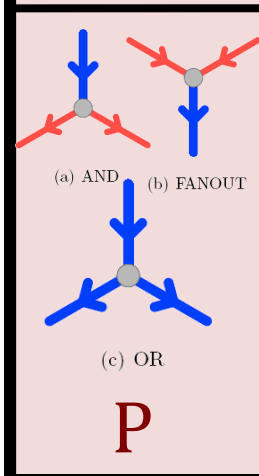
[Hearn & Demaine 2009]



unbounded



bounded



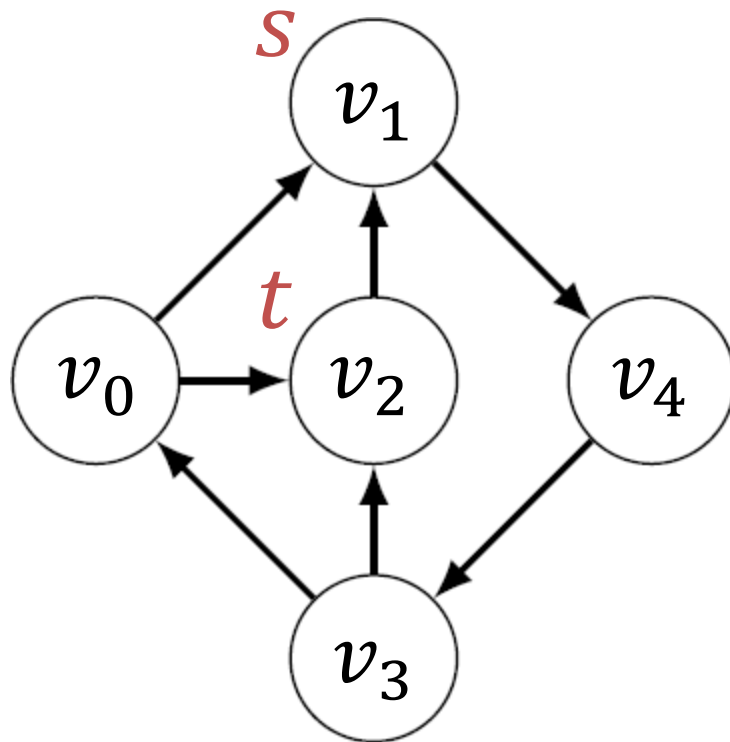
0 players  
(simulation)

1 player  
(puzzle)

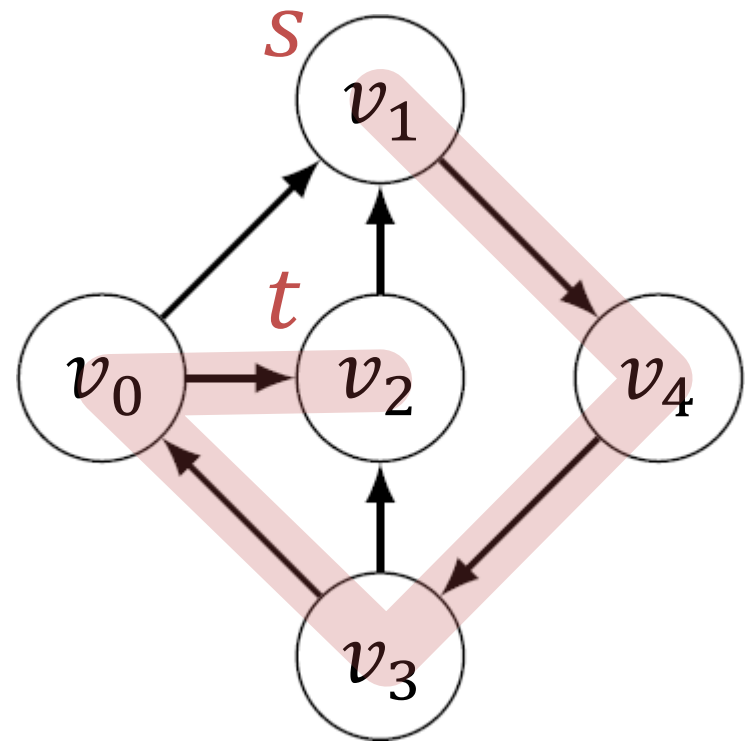
2 players  
(game)

team,  
imperfect info

# Hamiltonian $(s, t)$ -Path

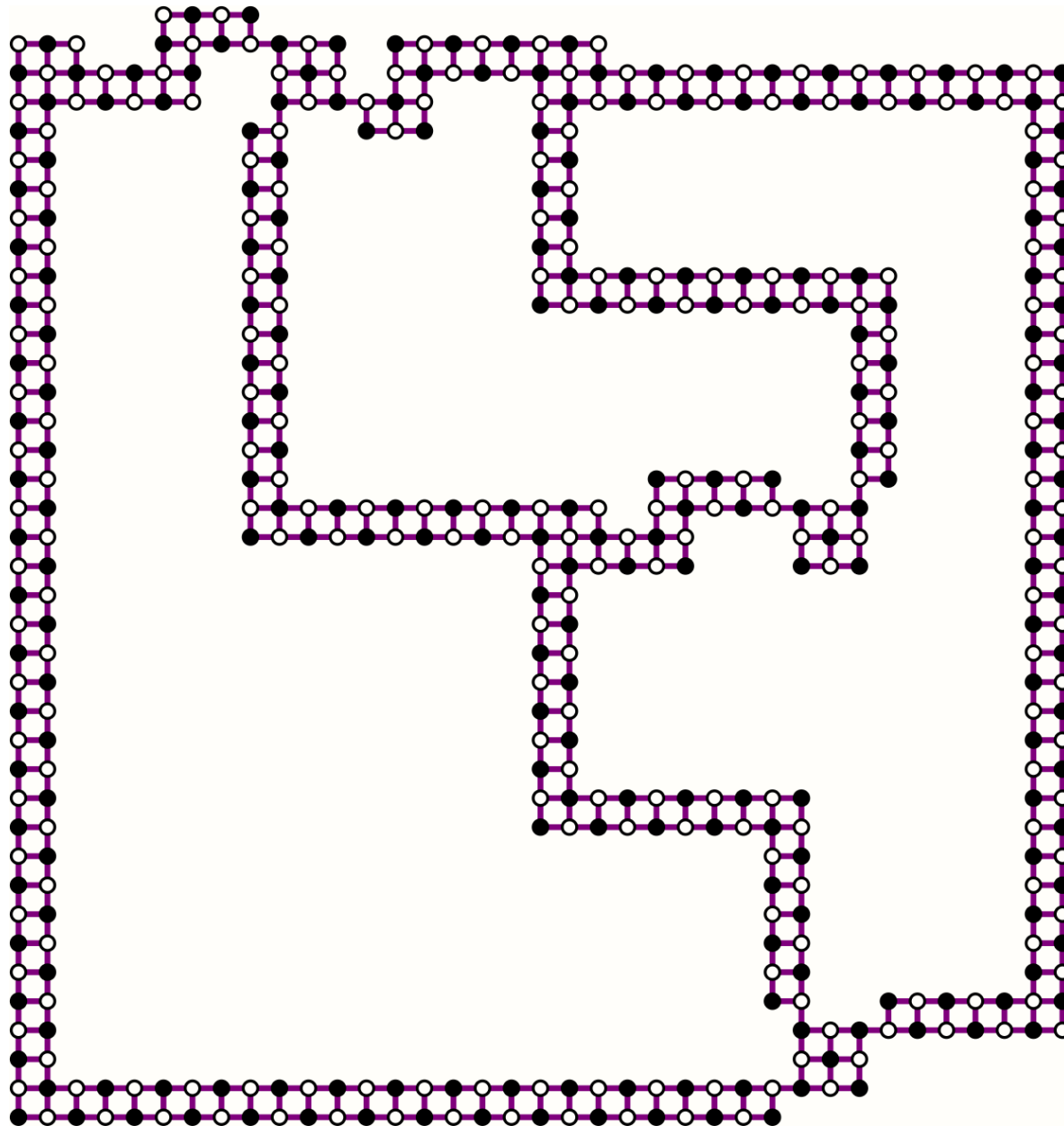


input



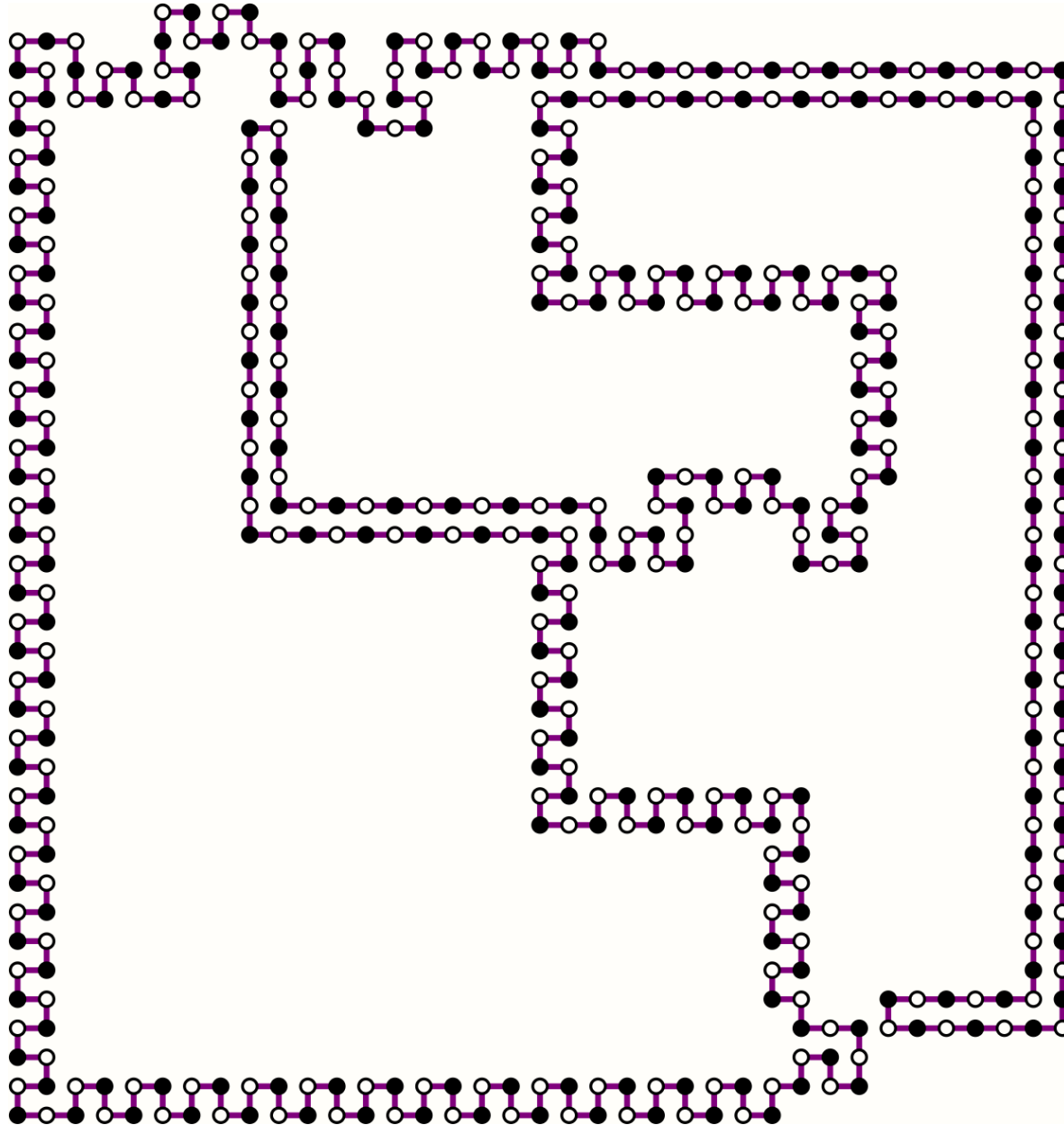
goal

# Hamiltonicity in Grid Graphs

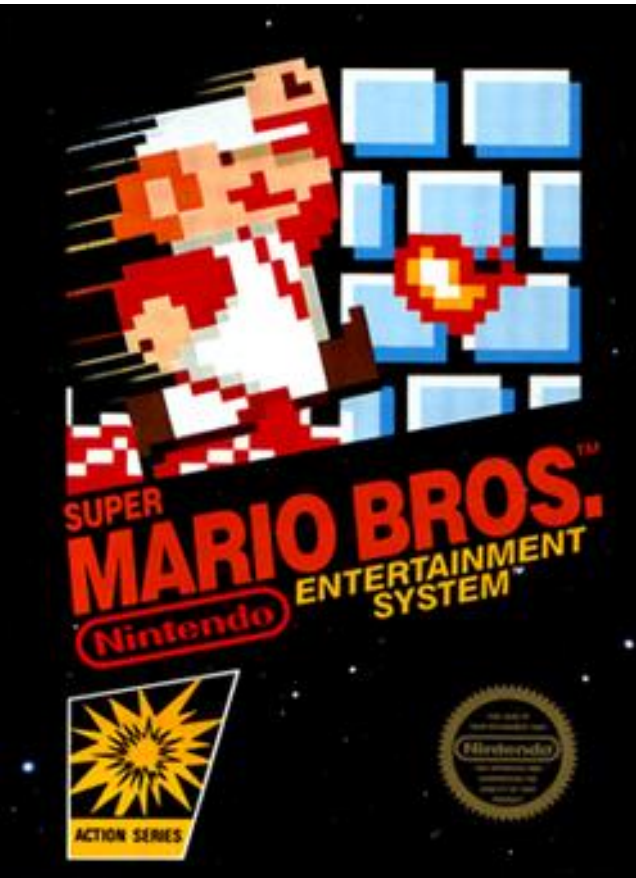




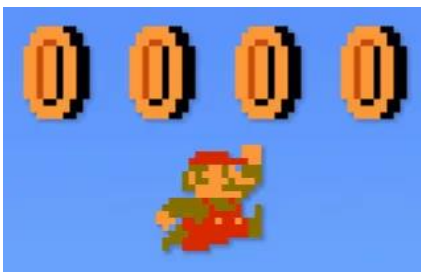
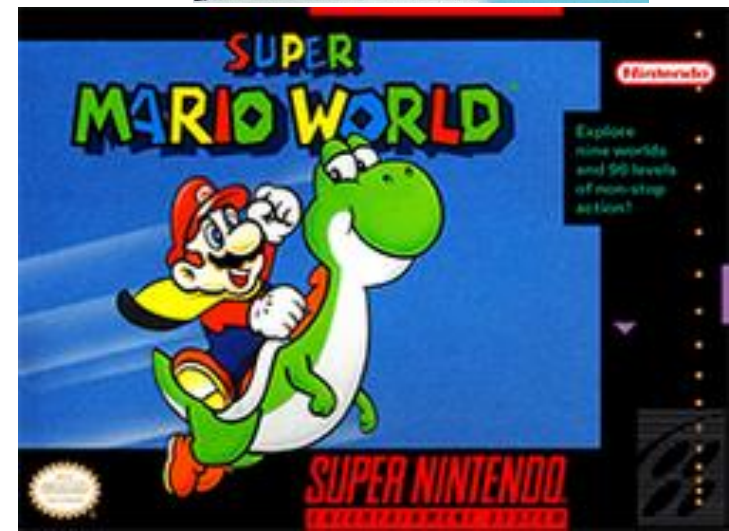
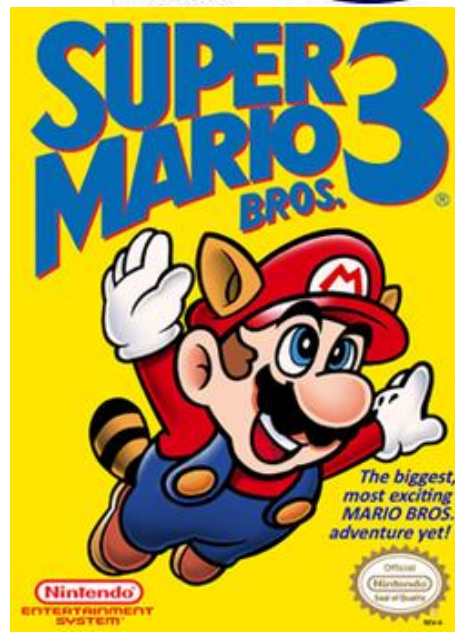
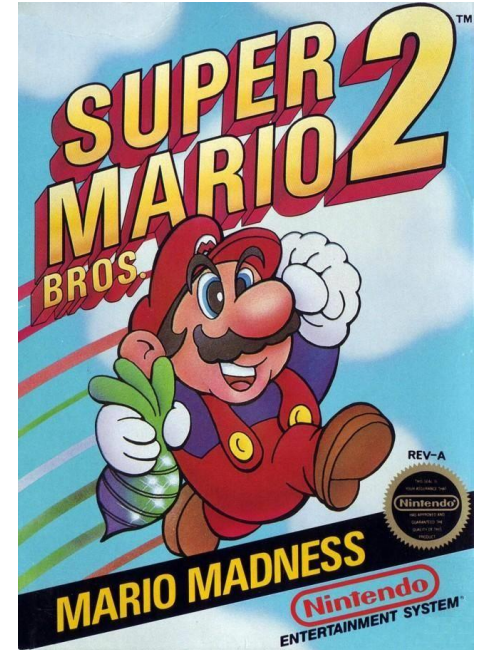
# Hamiltonicity in Grid Graphs



# 100% Speedrun is NP-hard: Mario



The Lost Levels



# Speedrun is NP-hard: Zelda

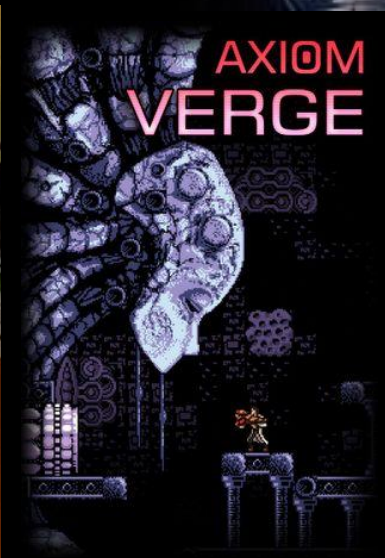


Small Key	
	
	Artwork of a Small Key from Ocarina of Time
<b>First appearance</b>	<i>The Legend of Zelda</i> (1987)
<b>Appearances</b>	<i>The Legend of Zelda</i> <i>Adventure of Link</i> <i>A Link to the Past</i> <i>Link's Awakening</i> <i>Ocarina of Time</i> <i>Majora's Mask</i> <i>Oracle of Ages</i> <i>Oracle of Seasons</i> <i>The Wind Waker</i> <i>Four Swords</i> <i>The Minish Cap</i> <i>Four Swords Adventures</i> <i>Twilight Princess</i> <i>Phantom Hourglass</i> <i>Spirit Tracks</i> <i>Skyward Sword</i> <i>A Link Between Worlds</i> <i>Breath of the Wild</i>
<b>Found</b>	Dungeons ( <i>Breath of the Wild</i> ) Shrines
<b>Use</b>	Open small locks

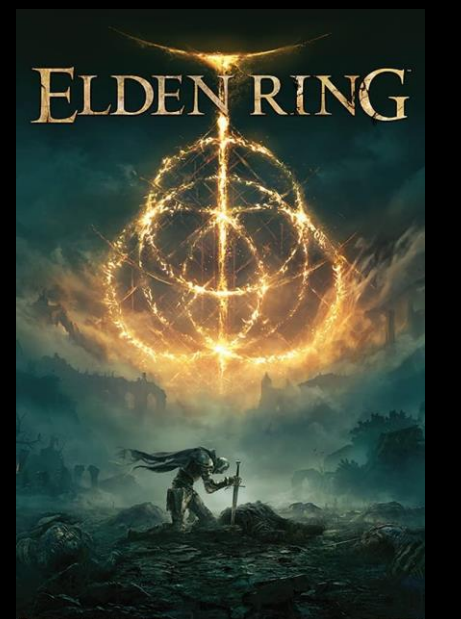
# Speedrun is NP-hard: Metroidvania



HOLLOW KNIGHT



# Speedrun is NP-hard: RPG



# Playing is NP-hard: Katamari



# The Witness

[Blow 2016]

## THE WITNESS



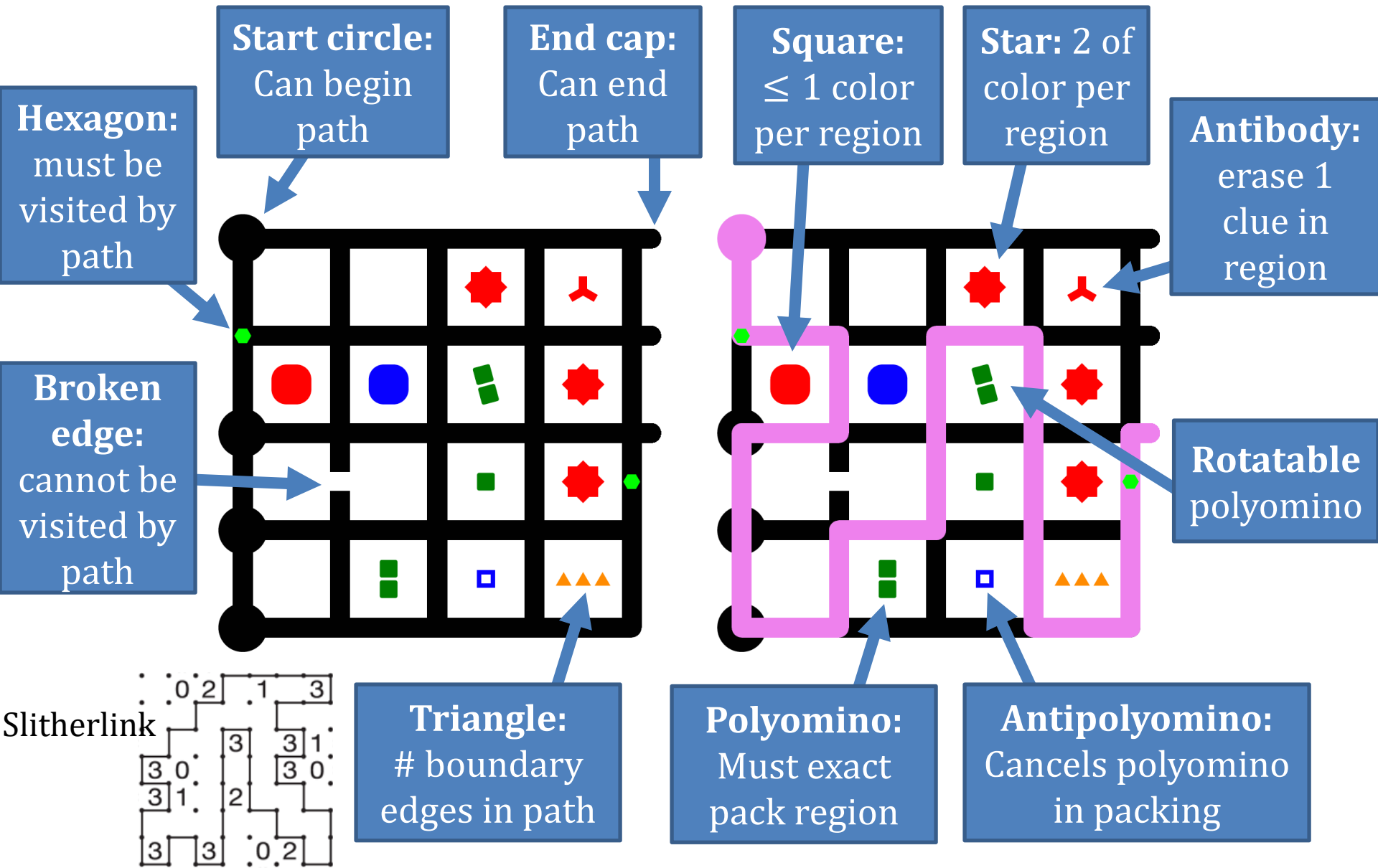
The Witness Challenge Time Trial (Non-sliding)	
1st	0:07
2nd	0:10
3rd	0:11
Maze Solution	0:15
1 of 4	0:25
2 of 4	0:30
3 of 4	0:35
4 of 4	0:40
<hr/>	
Pillar 2	1:25
	<b>0.00</b>
Previous Segment	-
Possible Time Save	-



<https://youtu.be/zCU5XWyJvWg>

RbdJellyfish, 2018

# The Witness Clue Types













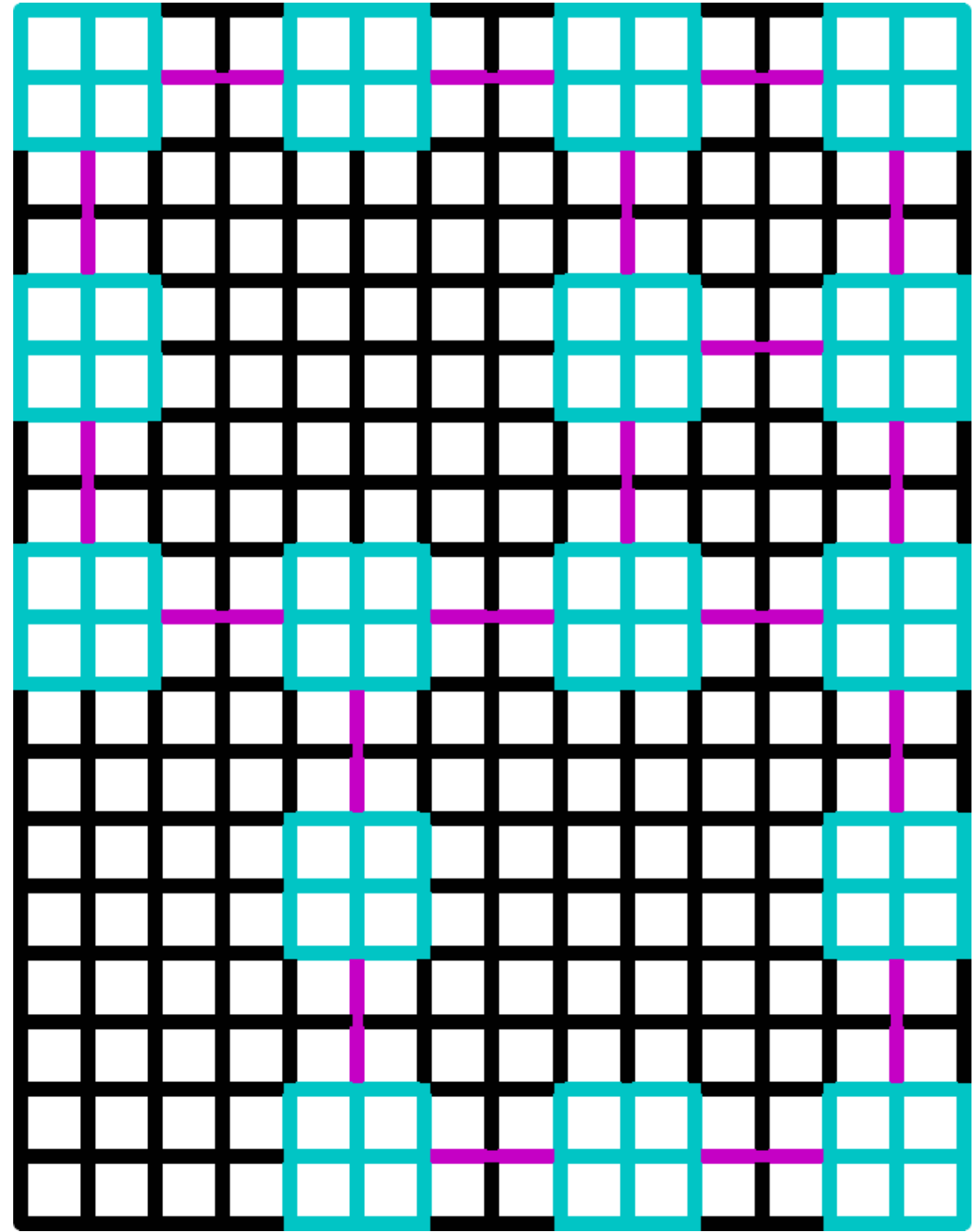
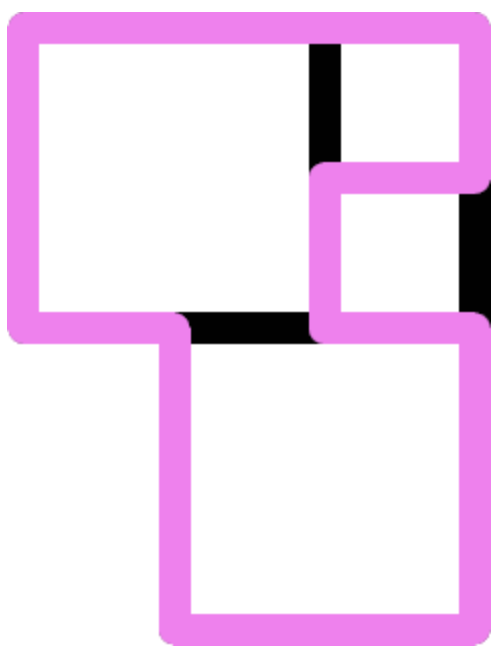
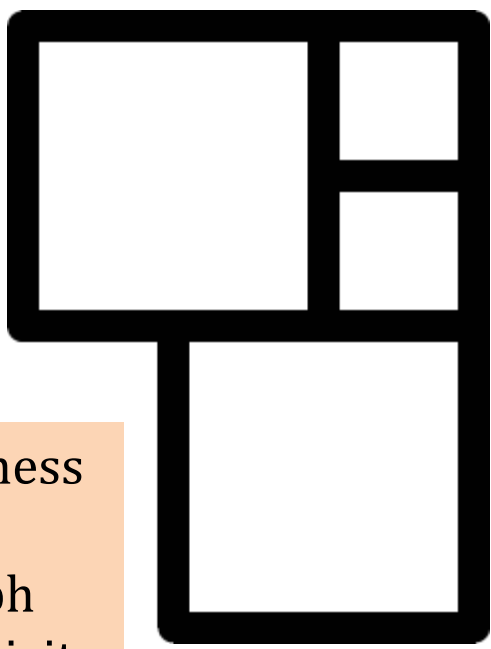
# WHO WITNESSES THE WITNESS?



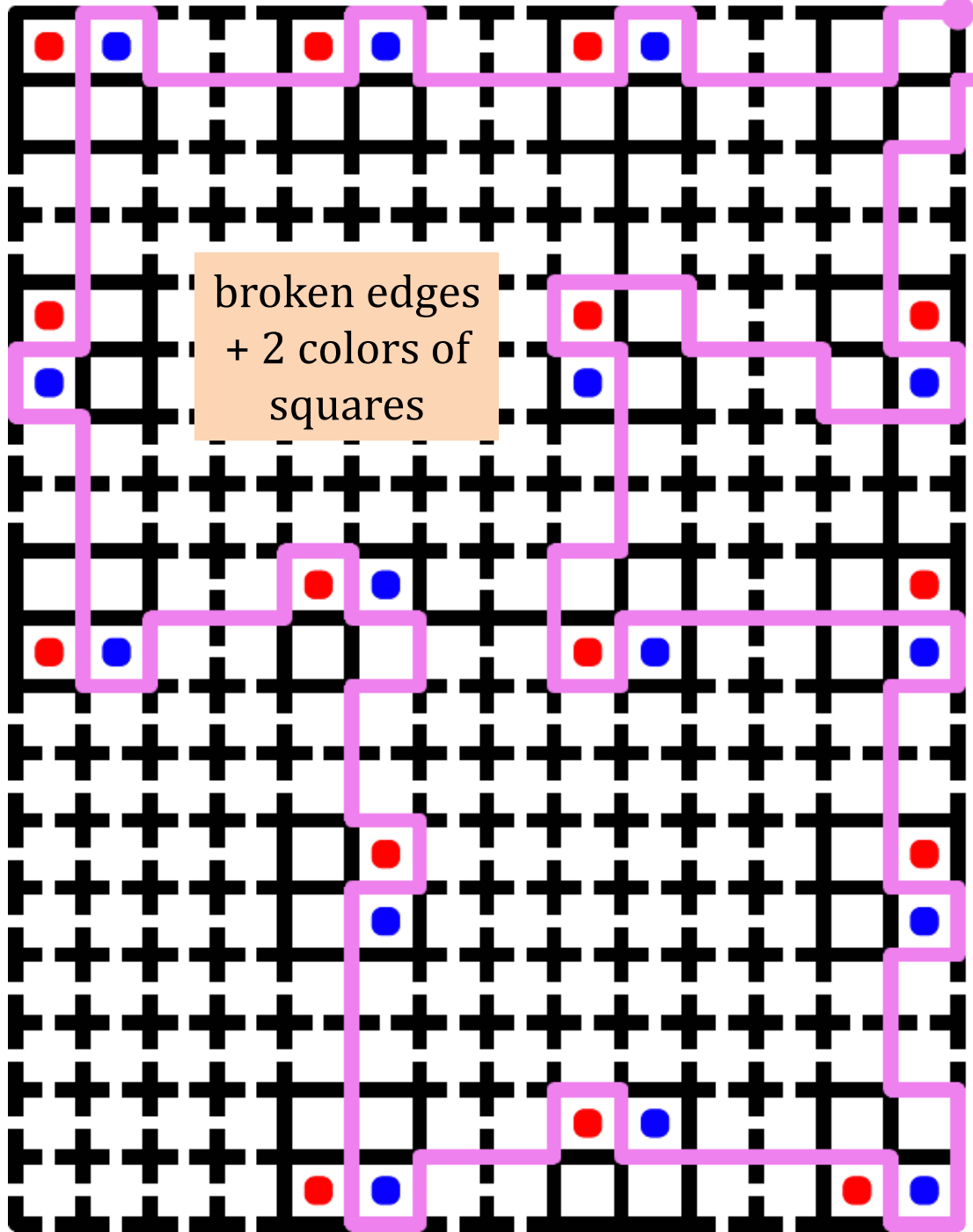
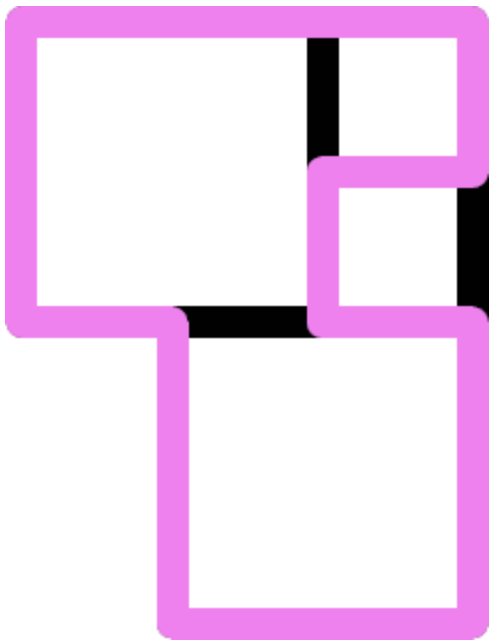
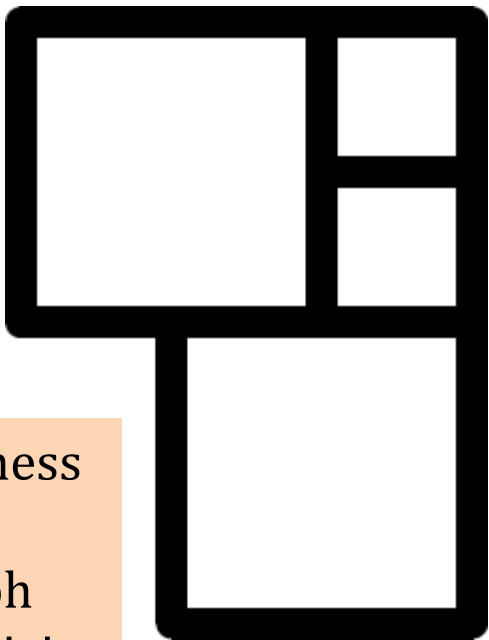
ZACHARY ABEL  
JEFFREY BOSBOOM  
ERIK DEMAINE  
LINUS HAMILTON  
ADAM HESTERBERG  
JUSTIN KOPINSKY  
JAYSON LYNCH  
MIKHAIL RUDOY

broken edge 	hexagon 	square 	star 	triangle 	polyomino 	antipolyomino 	antibody 	complexity	
✓								∈ L	
✓	✓ vertices							NP-complete	
	✓ vertices							<b>OPEN</b>	
	✓ edges							NP-complete	
✓	✓ on boundary							∈ P	
		✓ 1 color						always YES	
		✓ 2 colors	(also Kostitsyna, Löffler, Sandag, Sonke, Wulms 2018)						NP-complete
			✓ 1 color					<b>OPEN</b>	
			✓ n colors					NP-complete	
✓				✓ any			(Yato 2000)	NP-complete	
				✓ ▲				NP-complete	
				✓ ▲▲				NP-complete	
				✓ ▲▲▲				NP-complete	
					✓ ■			∈ P	
✓					✓ ■			∈ P	
					✓ ■	✓ □		NP-complete	
					✓ ■			NP-complete	
					✓ ■			NP-complete	
✓	✓	✓	✓	✓	✓	✓		∈ NP	
✓	✓	✓	✓	✓			✓ n	∈ NP	
					✓		✓ 2	Σ <sub>2</sub> -complete	
✓	✓	✓	✓	✓	✓		✓ 1	∈ NP	
					✓	✓	✓ 1	Σ <sub>2</sub> -complete	
✓	✓	✓	✓	✓	✓	✓	✓ n	∈ Σ <sub>2</sub>	

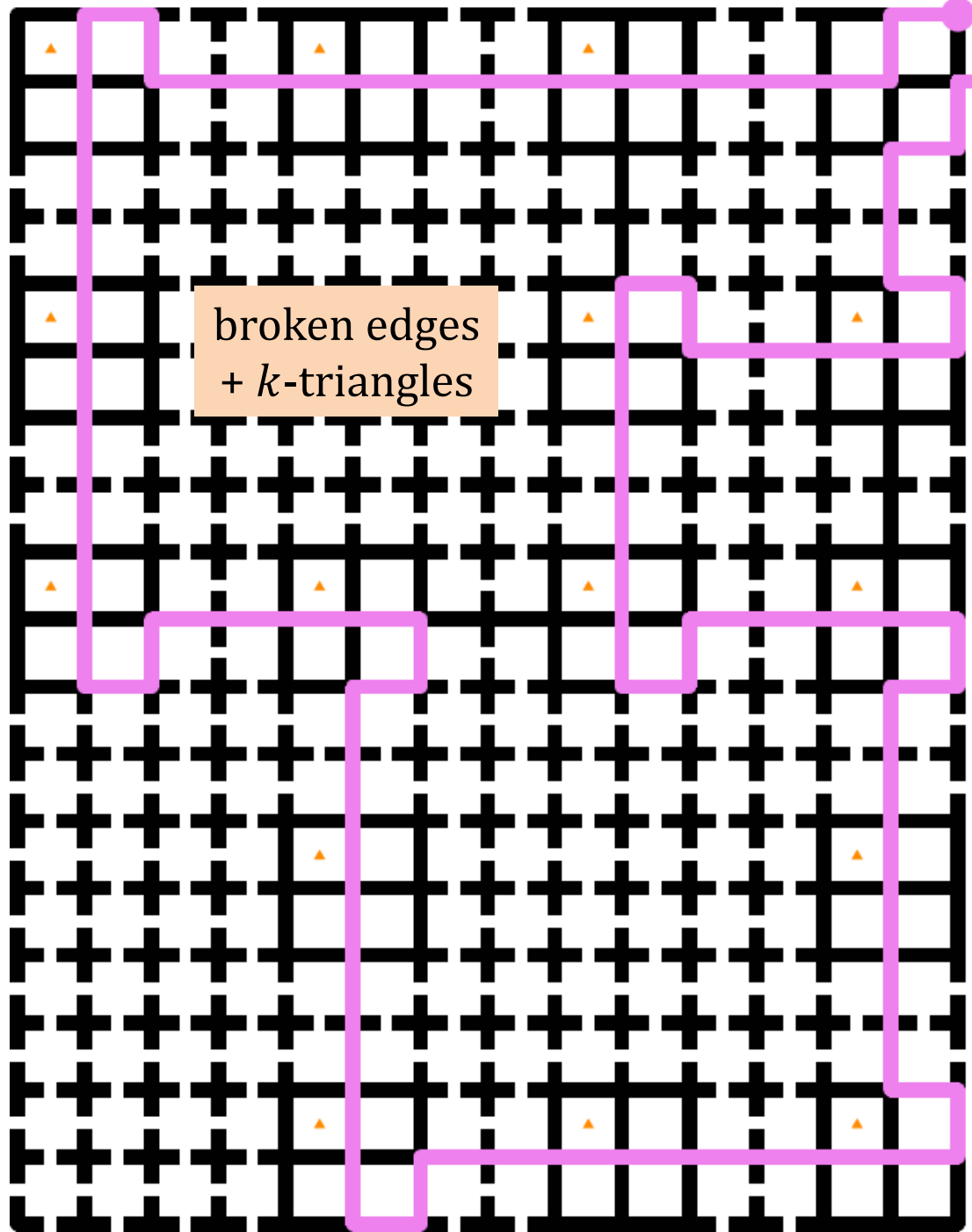
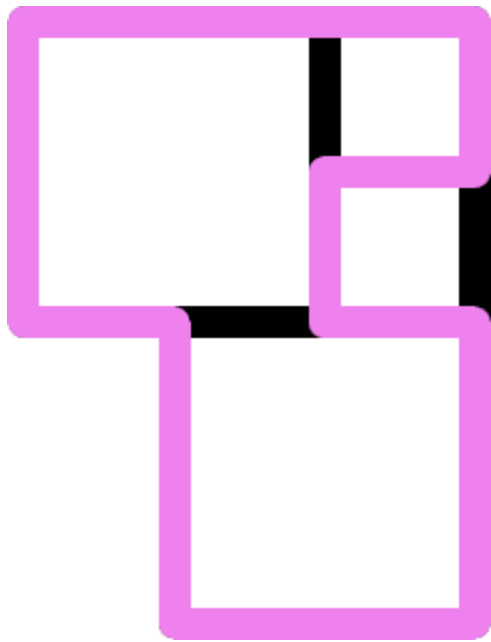
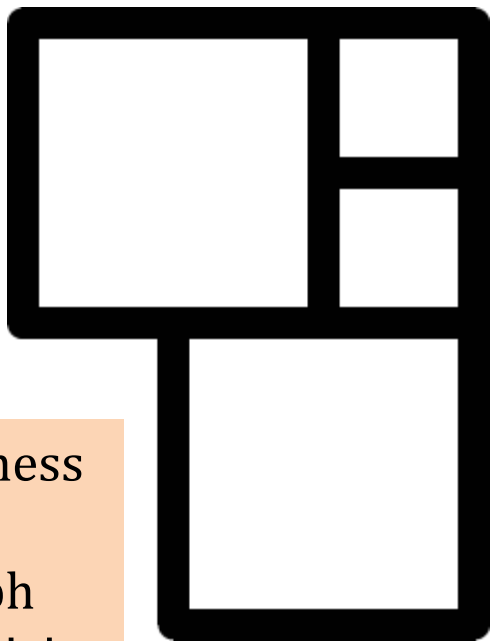
NP-hardness  
from  
grid-graph  
Hamiltonicity



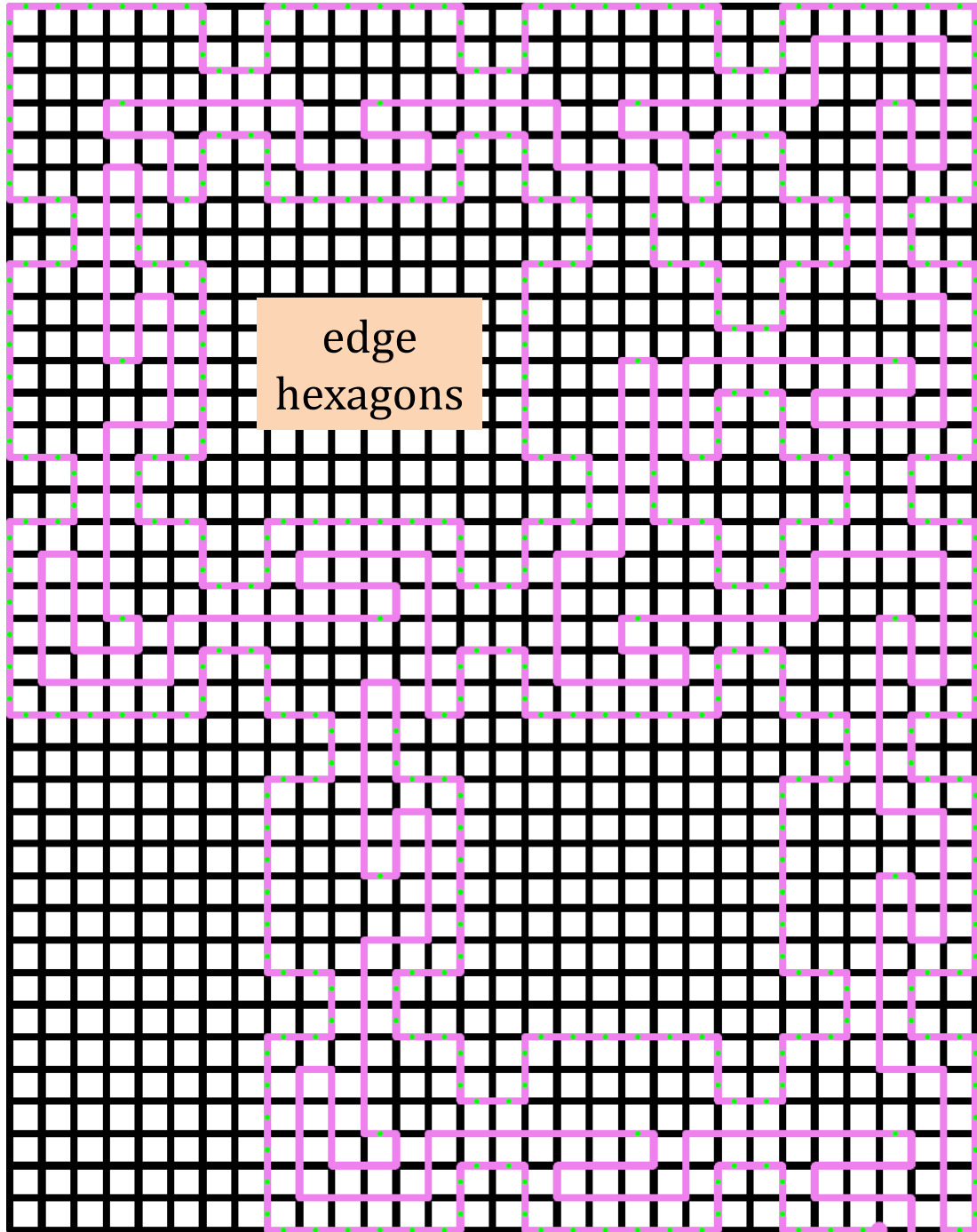
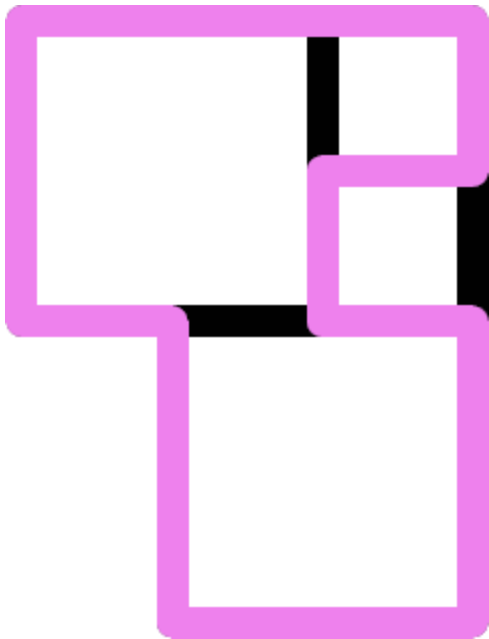
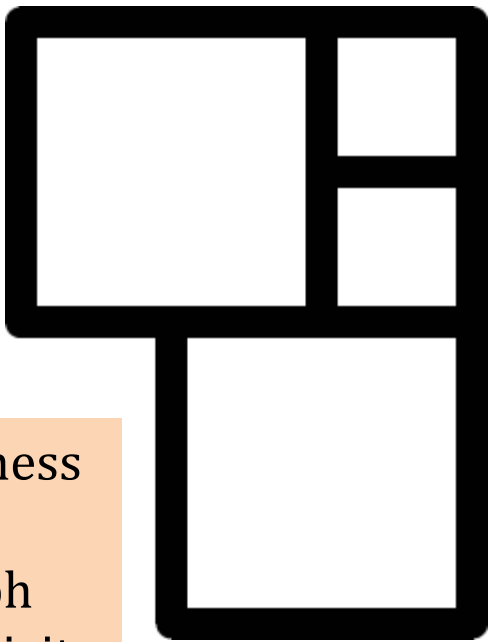
NP-hardness  
from  
grid-graph  
Hamiltonicity



NP-hardness  
from  
grid-graph  
Hamiltonicity

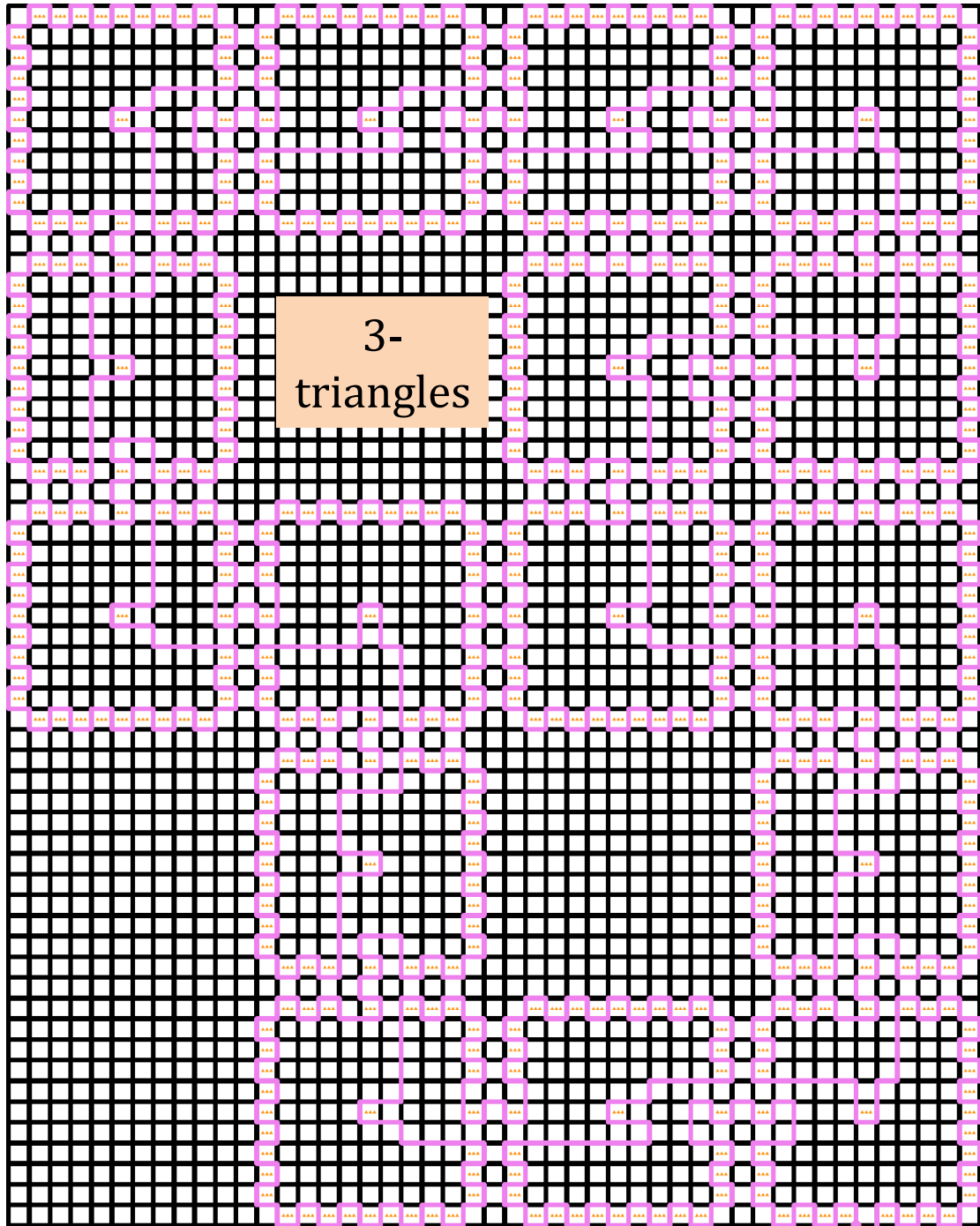
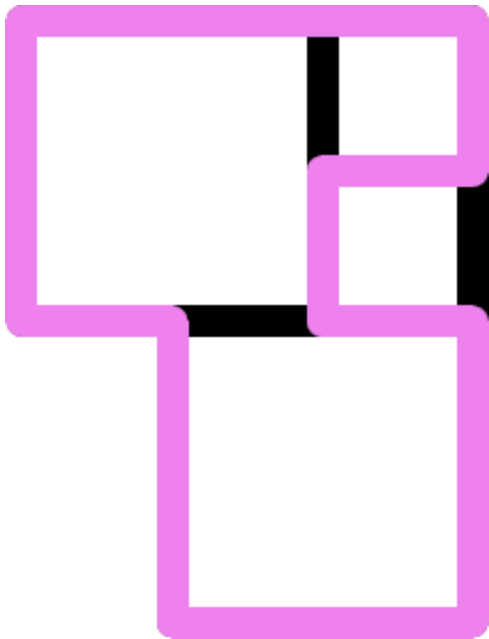
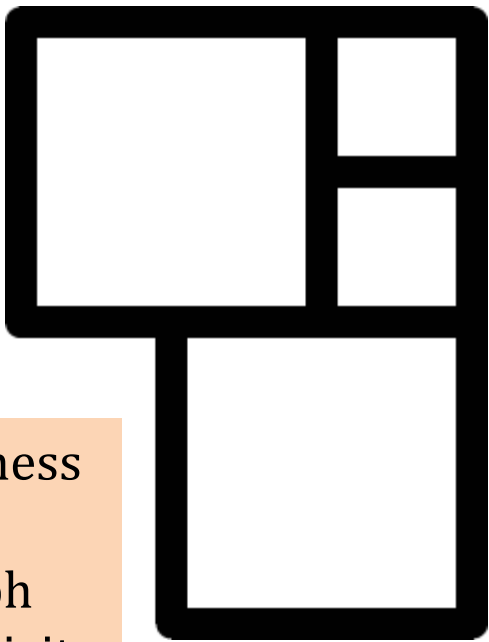


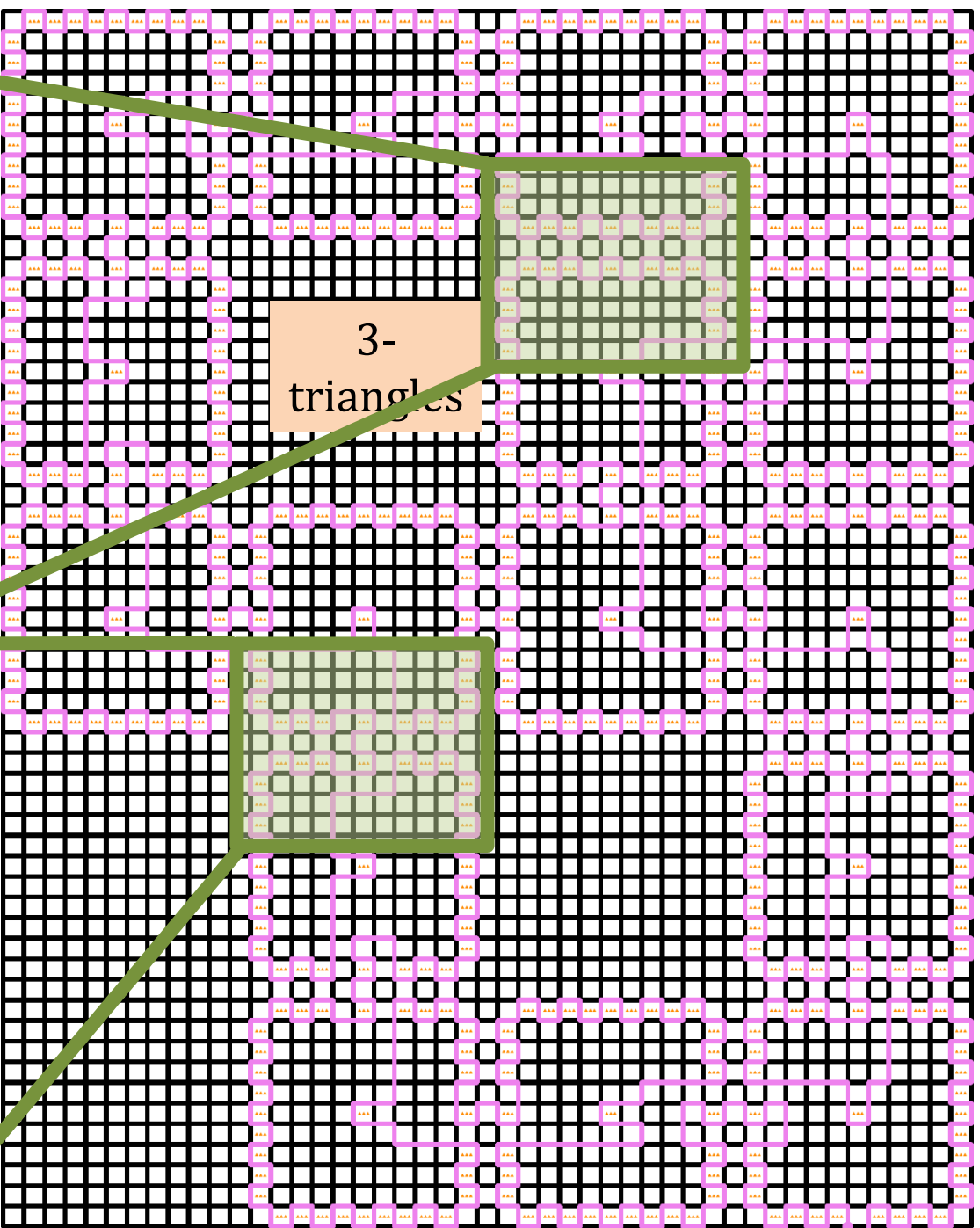
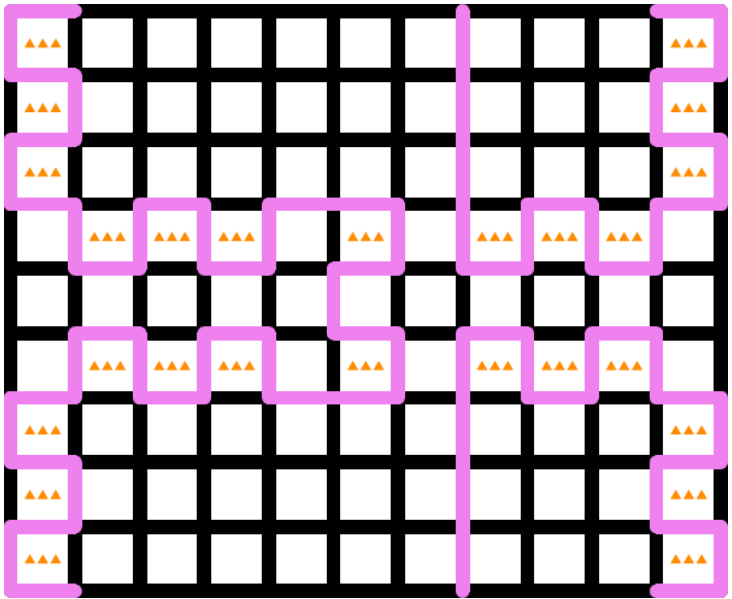
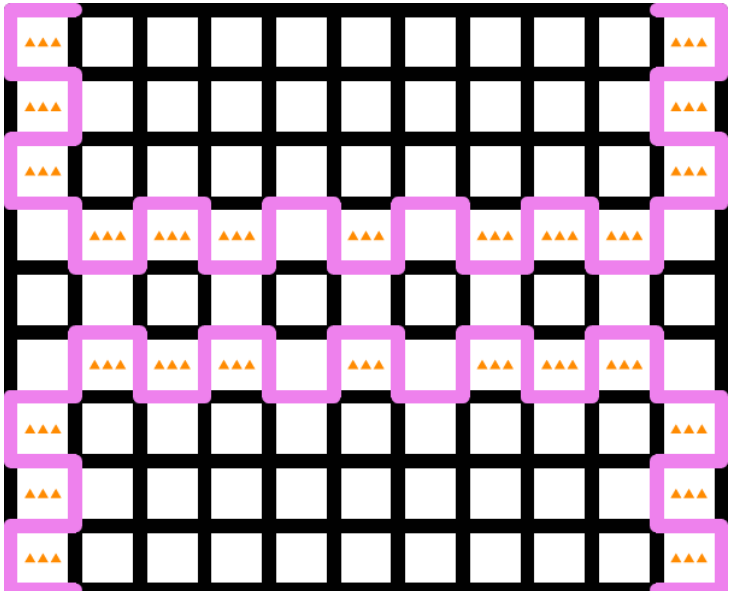
NP-hardness  
from  
grid-graph  
Hamiltonicity



edge  
hexagons

NP-hardness  
from  
grid-graph  
Hamiltonicity





3-  
triangles