



# Calculating with Pennies and Marbles



Marcus Schaefer  
DePaul University

Joint work with Anna Lubiw (University of Waterloo)

# Cast

Pennies

Marbles

Matchsticks



NP ..... *a complexity class*

$\exists \mathbb{R}$  ..... *another complexity class*

# Cast

Pennies

Marbles

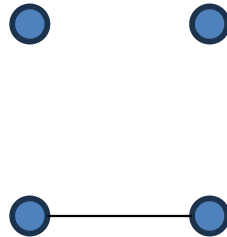
~~Matchsticks~~



NP ..... *a complexity class*

$\exists \mathbb{R}$  ..... *another complexity class*

# Pennies



coin graphs = planar graphs  
(Koebe's theorem)

**ON SETS OF DISTANCES OF  $n$  POINTS**  
 P. ERDÖS, Stanford University

1. **The function  $f(n)$ .** Let  $[P_n]$  be the class of all planar subsets  $P_n$  of  $n$  points and denote by  $f(n)$  the minimum number of different distances determined by its  $n$  points for  $P_n$  an element of  $\{P_n\}$ . Clearly,  $f(3)=1$  (with the three points forming the vertices of an equilateral triangle)  $f(4)=2$ ,  $f(5)=2$ . The following theorem establishes rough bounds for arbitrary  $n$ . Though I have sought to improve this result for many years, I have not been able to do so.

**THEOREM 1.** The minimum number  $f(n)$  of distances determined by  $n$  points satisfies the inequalities

$$c_1 n^{1/2} - 1/2 \leq f(n) \leq c_2 n / (\log n)^{1/2}.$$

**Problem 664 A.** In einer Ebene sind  $n$  ( $n \in \mathbb{N}$ ) kongruente abgeschlossene Kreisscheiben so gelagert, dass je zwei von ihnen höchstens einen Punkt gemeinsam haben. Vermutlich ist dann die maximal mögliche Anzahl der gemeinsamen Punkte (Berührungspunkte) der Kreisscheiben bei einer derartigen Lagerung  $[3n - \sqrt{12n - 3}]$ . Man beweise oder widerlege diese Vermutung.

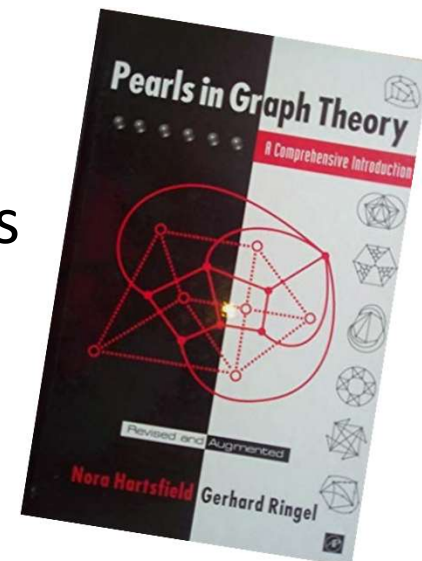
O. Reutter, Ochsenhausen, BRD

$$B(n) \geq z \geq [3n - \sqrt{12n - 3}] \tag{6}$$

nachgeprüft werden.

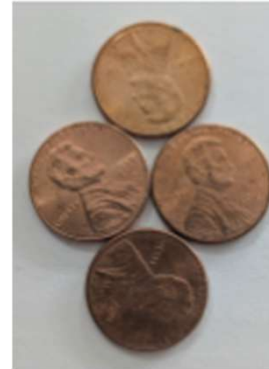
Mit (5) und (6) erweist sich die Vermutung somit als richtig.

H. Harborth, Braunschweig, BRD



# Penny Graph Recognition

$K_4 - e$   $\longrightarrow$



**Theorem** (Breu, Kirkpatrick, 1996/1998)

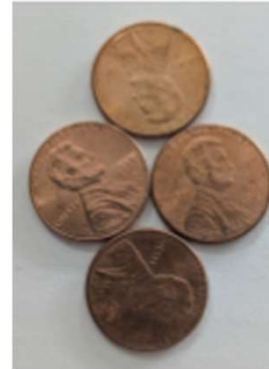
Recognizing penny graphs is NP-hard.

**Theorem** (Bowen, Durocher, Löffler, Rounds, Schulz, and Tóth, 2015)

Recognizing penny graphs is NP-hard if the graph is a tree.

# Penny Graph Recognition

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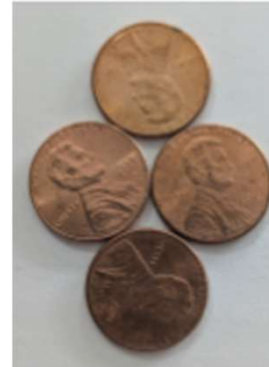
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Why NP-hard?

**Theorem** (Bowen, Durocher, Löffler, Rounds, Schulz, and Tòth, 2015)  
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# Penny Graph Recognition

$K_4 - e$



**Theorem** (Breu, Kirkpatrick, 1996/1998)

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Why NP-hard?

**Theorem** (Bowen, Durocher, Löffler, Rounds, Schulz, and Roth, 2015)

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decidable?

\*54·43.  $\vdash : \alpha, \beta \in 1 . \supset : \alpha \cap \beta = \Lambda . \equiv . \alpha \cup \beta \in 2$

*Dem.*

$\vdash . *54·26 . \supset \vdash : \alpha = \iota'x . \beta = \iota'y . \supset : \alpha \cup \beta \in 2 . \equiv . x \neq y .$

[\*51·231]  $\equiv . \iota'x \cap \iota'y = \Lambda .$

[\*13·12]  $\equiv . \alpha \cap \beta = \Lambda \quad (1)$

$\vdash . (1) . *11·11·35 . \supset$

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$\vdash . (2) . *11·54 . *52·1 . \supset \vdash . \text{Prop}$

# Definability

\*54:43.  $\vdash : \alpha, \beta \in 1 . \supset : \alpha \cap \beta = \Lambda . \equiv . \alpha \cup \beta = 1$

Dem.

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[\*51:231]

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From this proposition it will follow, wh

$K_4 - e \longrightarrow$

$$\begin{aligned}
 & (\exists x_1, y_1, x_2, y_2, x_3, y_3, x_4, y_4) \\
 & (x_1 - x_2)^2 + (y_1 - y_2)^2 = 1 \wedge \\
 & (x_1 - x_3)^2 + (y_1 - y_3)^2 = 1 \wedge \\
 & (x_2 - x_3)^2 + (y_2 - y_3)^2 = 1 \wedge \\
 & (x_2 - x_4)^2 + (y_2 - y_4)^2 = 1 \wedge \\
 & (x_3 - x_4)^2 + (y_3 - y_4)^2 = 1 \wedge \\
 & (x_1 - x_4)^2 + (y_1 - y_4)^2 > 1
 \end{aligned}$$



\*54.43.  $\vdash \cdot \alpha, \beta \in 1. \supset : \alpha \wedge \beta = \Lambda. \equiv. \alpha \vee \beta = \Lambda.$   
*Dem.*  
 $\vdash. *54.26. \supset \vdash : \alpha = t'x. \beta = t'y. \supset :$   
 $[*51.231]$   
 $[*13.12]$   
 $\vdash. (1). *11.11.35. \supset$   
 $\vdash : (\forall x, y). \alpha = t'x. \beta = t'y. \supset :$   
 $\vdash. (2). *11.54. *52.1. \supset \vdash. \text{Prop}$   
 From this proposition it will follow, wh

# Existential Theory of the Reals

$$(\exists x)(\exists y)(\exists z)[(2xy - x^2 = z) \wedge (5xy = z^4 \vee 5xy = -z^5)]$$

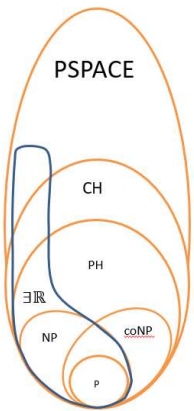
Signature:      +, -, ·, ,  
                          0, 1,  
                          =, <  
                          Boolean operators

ETR = set of all formulas in this signature true **over the reals**

Compare:

- Existential Theory of GF[2]
- Existential Theory of the Natural Numbers
- Existential Theory of the Rationals
- Existential Theory of the Complex Numbers

# Existential Theory of the Reals



$$(\exists x)(\exists y)(\exists z)[(2xy - x^2 = z)$$



PROJECT RAND  
 A DECISION METHOD FOR ELEMENTARY ALGEBRA AND GEOMETRY  
 ALFRED TARSKI  
 Prepared for Publication by J. C. C. McKinsey  
 This report, although published by the RAND Corporation, was written while the Project was a part of Douglas Aircraft Co., Inc.  
 August 1, 1948  
 (Revised May, 1951)

ETR = set of all formulas in

is

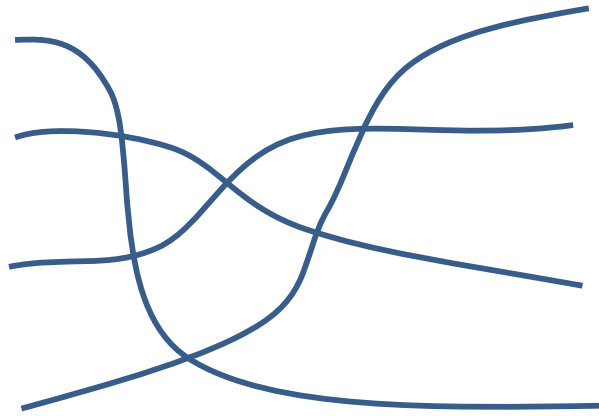
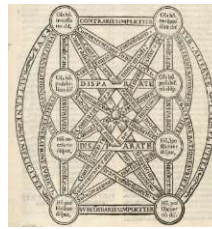
Compare:

- Existential Theory of GF[2]
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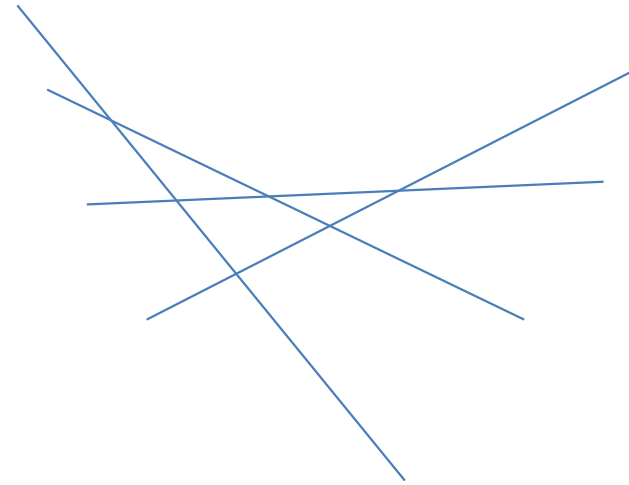
R-109



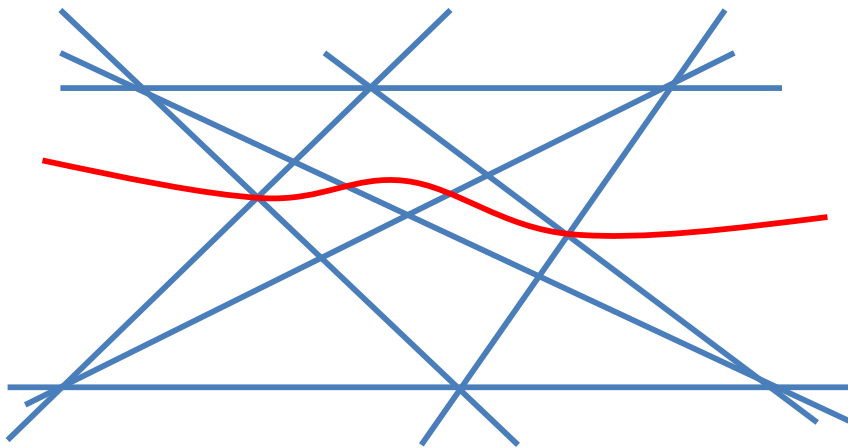
# STRETCHABILITY



Pseudoline arrangement

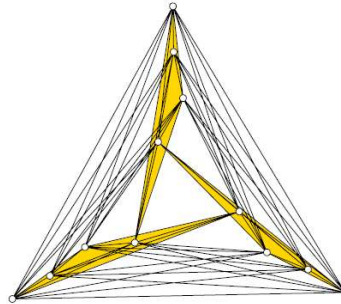
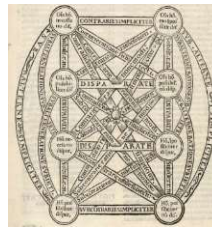


Equivalent line arrangement



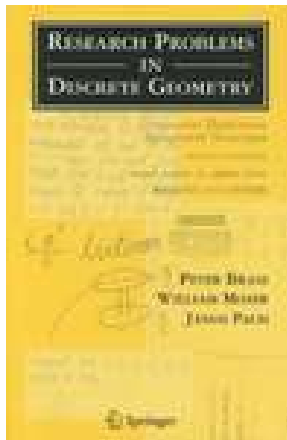
Not stretchable (Pappus' Configuration)

# Rectilinear Crossing Number

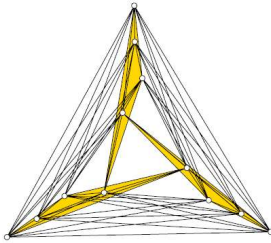


However, we know only that computing the rectilinear crossing number is *NP-hard* [Bi91].

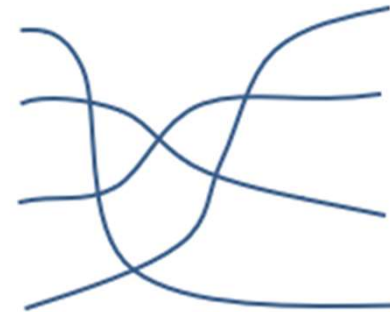
**Problem 2** Given a graph  $G$  of  $n$  vertices and an integer  $K$ , can one check in polynomial time whether  $\text{lin-cr}(G) \leq K$ ? In other words, is the above problem in *NP*?



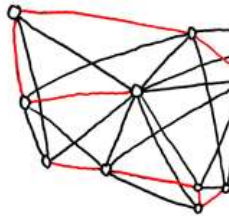
# Power of ETR



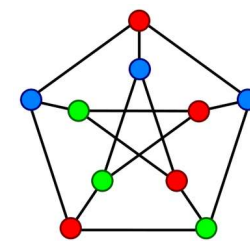
Rectilinear Crossing Number



Pseudoline Stretchability



Euclidean TSP



3-Colorability

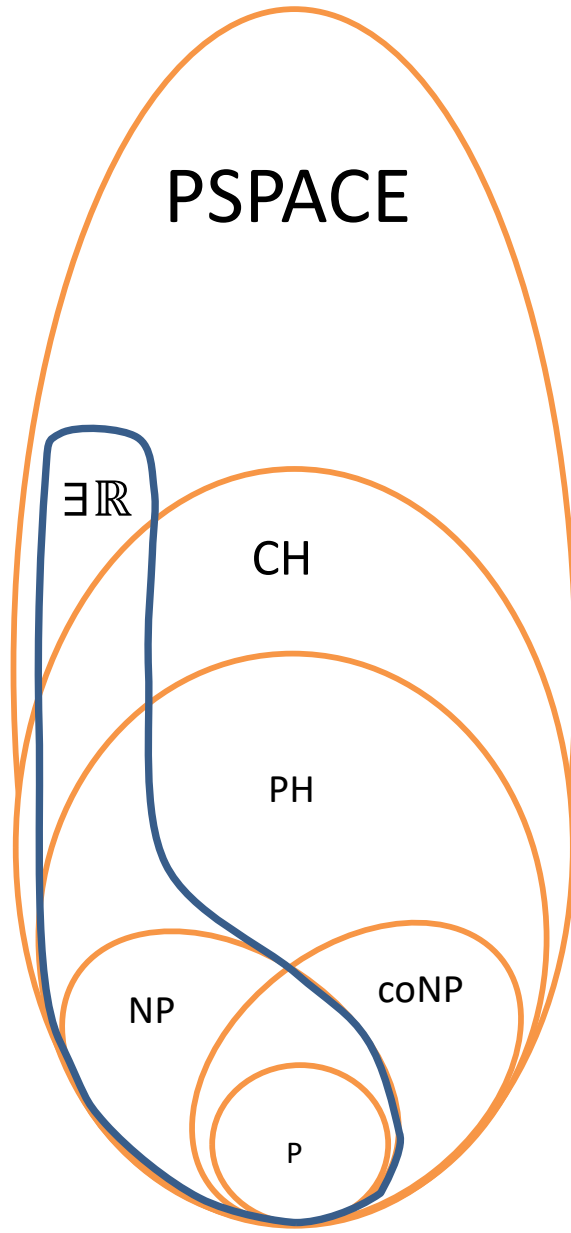
$\exists x_1, x_2, \dots \varphi(x_1, x_2, \dots)$

SATISFIABILITY

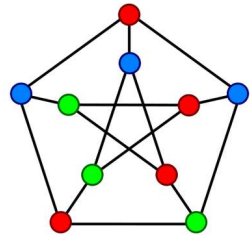
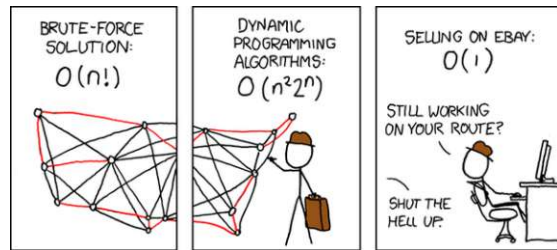
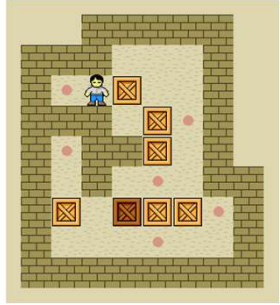
$\exists c_1, \dots, c_{10}, x_1, y_1, \dots, x_{10}, y_{10},$   
 $c_1 = x_1 + y_1, x_1^2 = x_1, y_1^2 = y_1, \dots,$   
 $c_{10} = x_{10} + y_{10}, x_{10}^2 = x_{10}, y_{10}^2 = y_{10},$   
 $c_1 \neq c_2, c_1 \neq c_5, c_1 \neq c_6, \dots, c_8 \neq c_{10}$

$$\sqrt{3} + \sqrt{5} \stackrel{?}{<} \sqrt{7}$$

Sum of Square Roots



# How Hard is This?

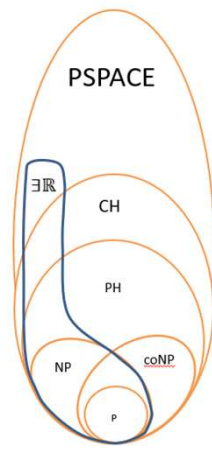
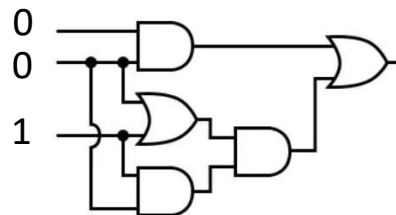


$$\exists x_1, x_2, \dots \varphi(x_1, x_2, \dots)$$

SAT

TAUT

$$\forall x_1, x_2, \dots \varphi(x_1, x_2, \dots)$$



PSPACE

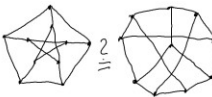
CH

PH

NP

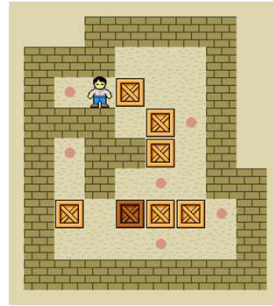
coNP

P

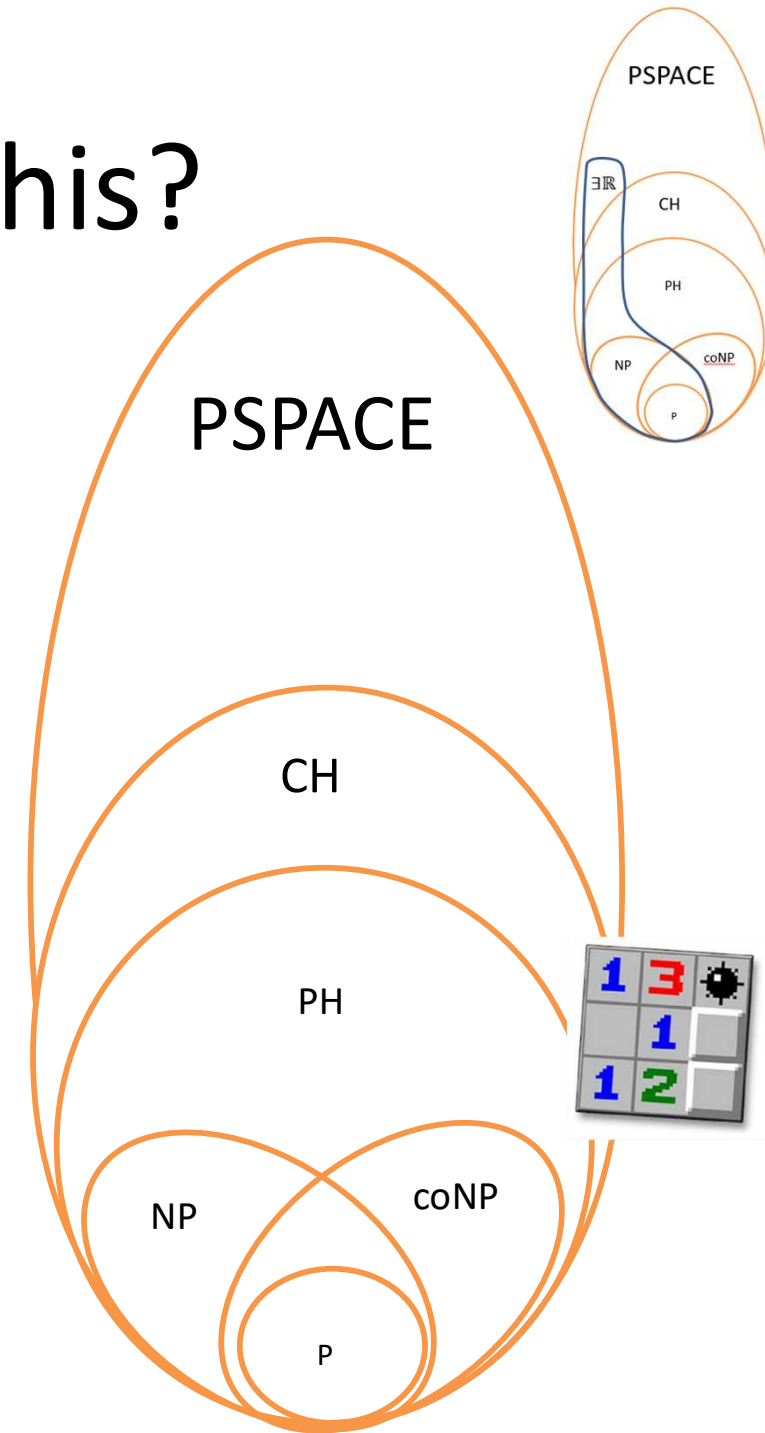


$$15 = ? * ?$$

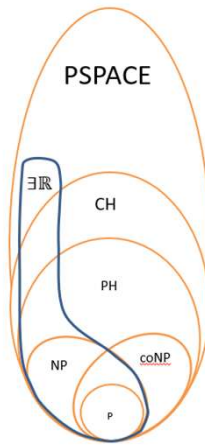
# How Hard is This?



- measuring computational hardness directly is often difficult
- instead: use relative measure (reductions)
- need a notion of computationally easy: P (polynomial-time)



$\exists \mathbb{R}$



$\exists \mathbb{R} := \{L \subseteq \{0,1\}^* : L \leq \text{ETR}\}$

$\text{NP} \subseteq \exists \mathbb{R} \subseteq \text{PSPACE}$



Canny, 1988

$L$  is  $\exists \mathbb{R}$ -hard: for all  $L' \in \exists \mathbb{R} : L' \leq L$

$L$  is  $\exists \mathbb{R}$ -complete:  $\exists \mathbb{R}$ -hard and in  $\exists \mathbb{R}$

# Where is $\exists\mathbb{R}$ ?



QBF

PSPACE

$\exists\mathbb{R}$

CH

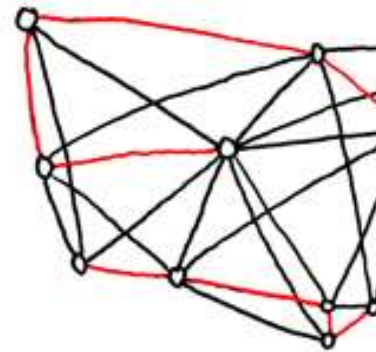
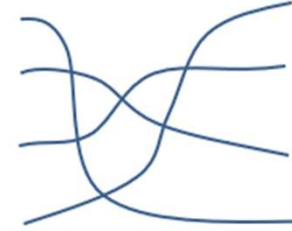
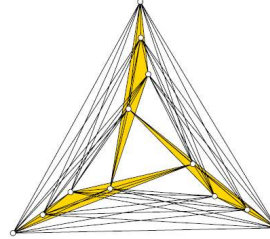
PH

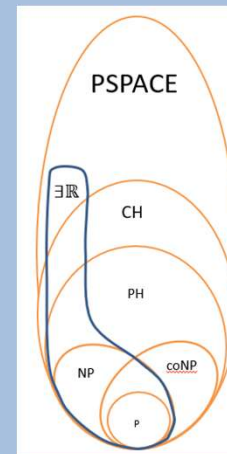
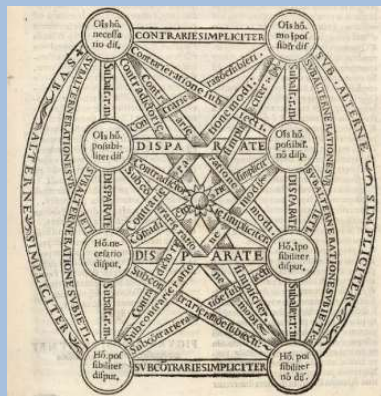
NP

coNP

P

SSQRT





$\exists R$

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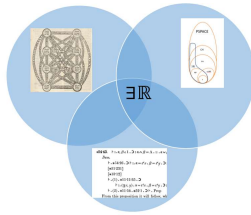
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From this proposition it will follow, wh

# Some $\exists \mathbb{R}$ -completeness Result



Geometric Realizability of complete graph (Kyncl, 2007)

Simultaneous Geometric Embeddability (Cardinal, Kusters 2014)

Inscribed polytopes and Delaunay triangulations (Adiprasito, Padrol, Theran, 2015)

Intersection graphs of

segments (Kratochvil, Matousek, 1994)

unit segments (Hoffmann, Miltzow, Weber, and Wulf, 2024)

lines in  $\mathbb{R}^3$  (Cardinal 2024)

ellipses, convex sets (S 2008)

unit disks, disks (McDiarmid, Müller, 2010)

dot-product graphs (Kang, Müller, 2012)

rays and grounded segments (Cardinal, Felsner, Miltzow, Tompkins, Vogtenhuber, Birgit, 2018)

pseudocircles (Felsner, Scheucher, 2020)

Topological Inference

with convexity (Davis, Gotts, Cohn, 1999)

Art Gallery Problem (Abrahamsen, Adamaszek, Miltzow, 2017)

Planar Slope Number (Hoffmann, 2016)

Allowable Sequence realizabilty (Hoffmann, 2017)

Visibility Graphs (Cardinal, Hoffmann, 2017)

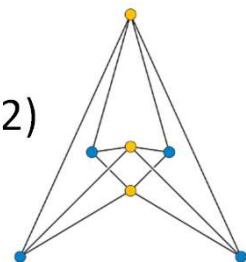
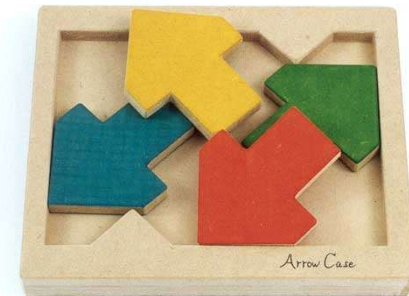
Packing Problem (Abrahamsen, Miltzow, Seiferth, 2020, Abrahamsen 2024)

Spanners w/ ratio 1 (Aichholzer, Borrizzo, Bose, Cardinal, Frati, Morin, Vogtenhuber, 2022)

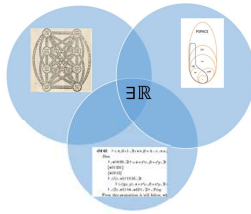
Training Neural Networks (Abrahamsen, Kleist, Miltzow, 2021)

RAC-drawability (S 23)

Star-shapedness (Štefankovič, S 25)



# Some $\exists \mathbb{R}$ -completeness Result



- Geometric Realizability of complete graphs (Schaefer, 2007)
- Simultaneous Geometric Embedding (Kusters 2011)
- Inscribed polytopes (Adiprasita)
- Intersection graphs of line segments (Materov)
- unit segments (Hoffmann)
- lines in  $\mathbb{R}^3$  (Materov)
- ellipses (Materov)

For More

*The Existential Theory of the Reals as a Complexity Class: A Compendium*

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Tillmann Miltzow  
Utrecht University, Utrecht, The Netherlands,  
t.miltzow@uu.nl

Topology

Art Gallery

Planar Slope

Allowable Set

Visibility Graph

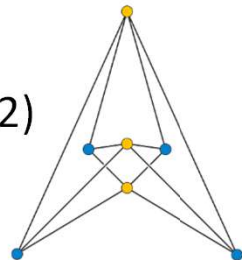
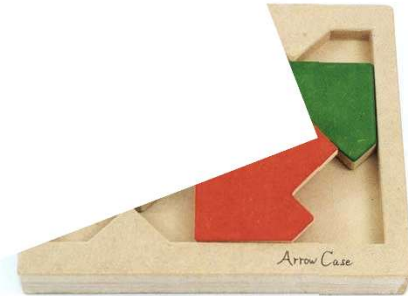
Packing Problem

Spanners w/ rays

Training Neural Networks

RAC-drawability (Schaefer)

Star-shapedness (Schaefer, S 25)



(Grahamson 2024)  
(Cardinal, Frati, Morin, Vogtenhuber, 2022)  
(Schaefer, Miltzow, 2021)

# Calculating with Pennies

## Theorem (Lubiw, Schaefer, 2025)

Recognizing penny graphs is  $\exists\mathbb{R}$ -complete even if a combinatorial embedding is given.



# Proving $\exists \mathbb{R}$ -hardness

## Algebraic Encoding

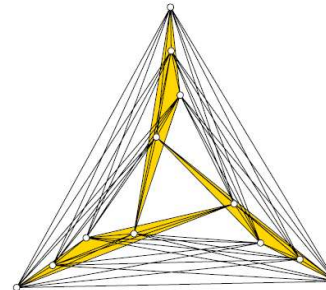
encode

- real numbers,
- addition, multiplication
- (in)equalities



## Stretchability Encoding

encode pseudoline incidences



# Proving $\exists \mathbb{R}$ -hardness

## Algebraic Encoding

encode

- real numbers,
- addition, multiplication
- (in)equalities

## Stretchability Encoding

encode pseudoline incidences

## ETRINV

Is there  $x \in \left(\frac{1}{2}, 2\right)^n$  satisfying equations of types

$$x_i = x_j + x_k$$

$$x_i x_j = 1$$



$\exists \mathbb{R}$ -complete by Abrahamsen, Adamaszek, and Miltzow, 2018

# $\exists \mathbb{R}$ -hardness of Penny Graphs

## ETRINV

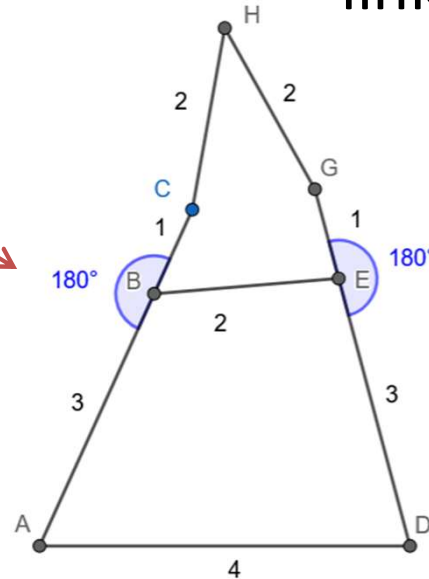
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$$x_i = x_j + x_k$$

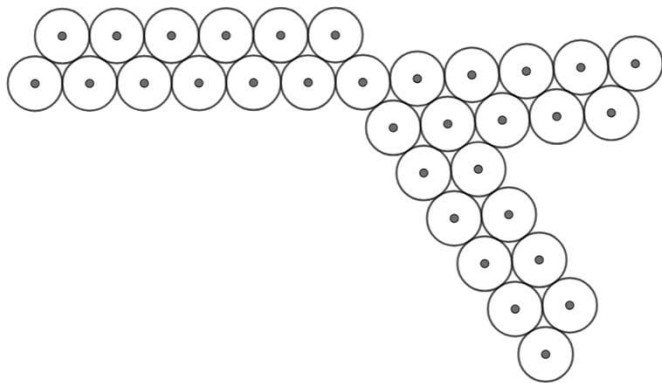
$$x_i x_j = 1$$

angle-constrained linkage

Step 1



Step 2

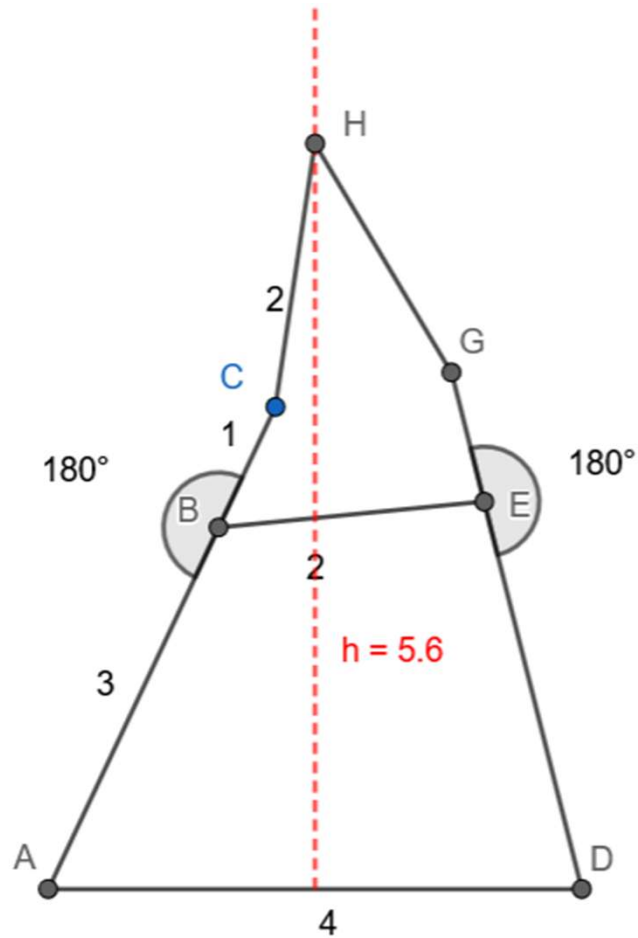


penny graph

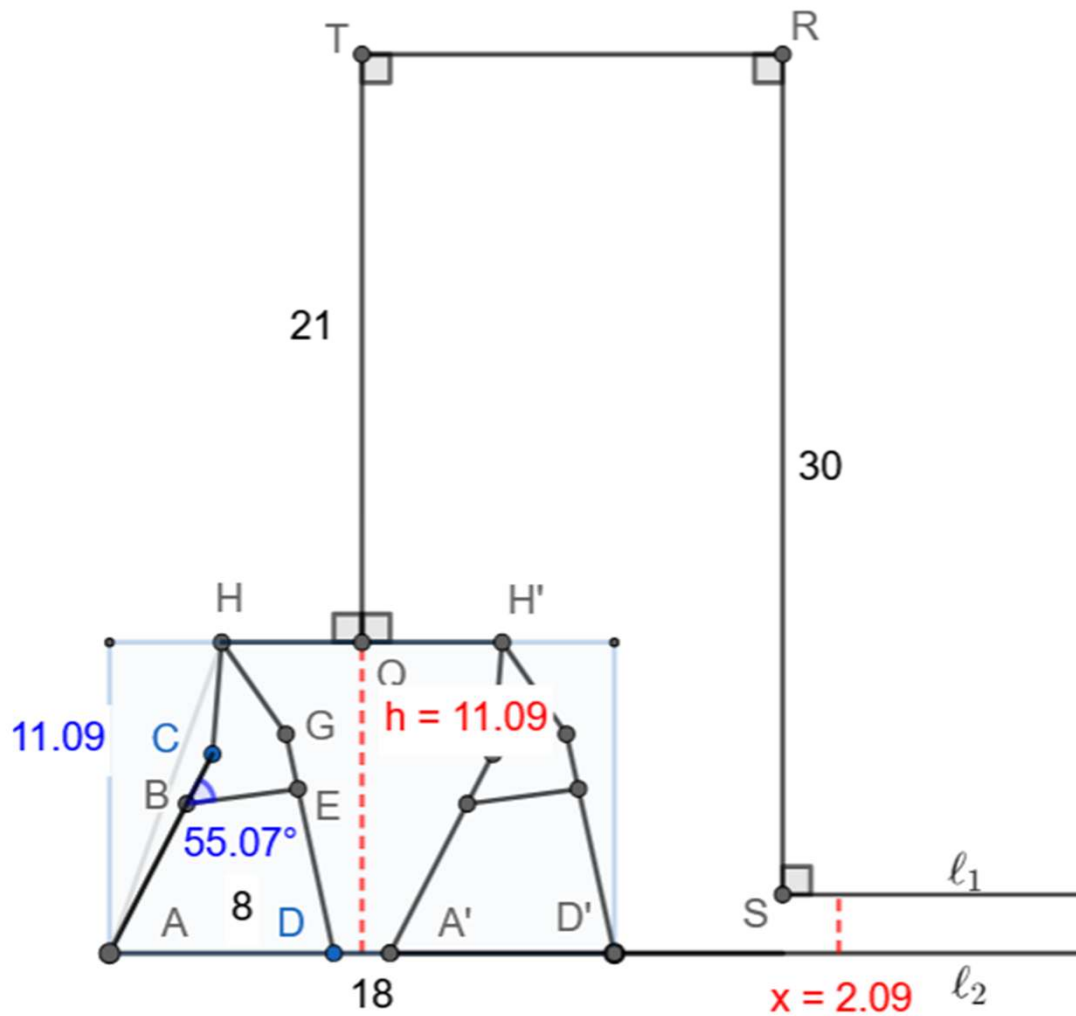
**STEP 1**

**ETRINV → LINKAGES**

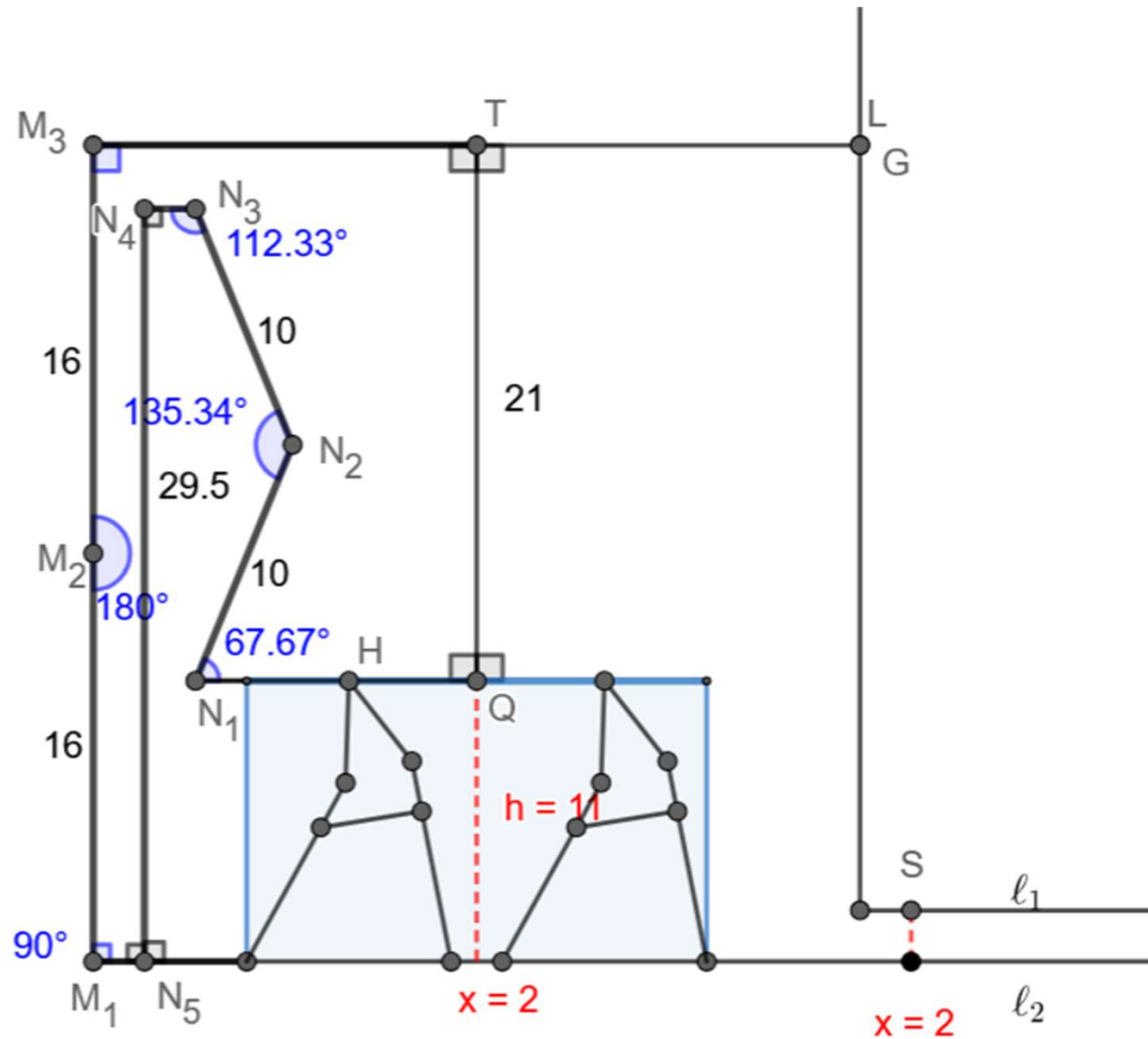
# Hart's A-Frame



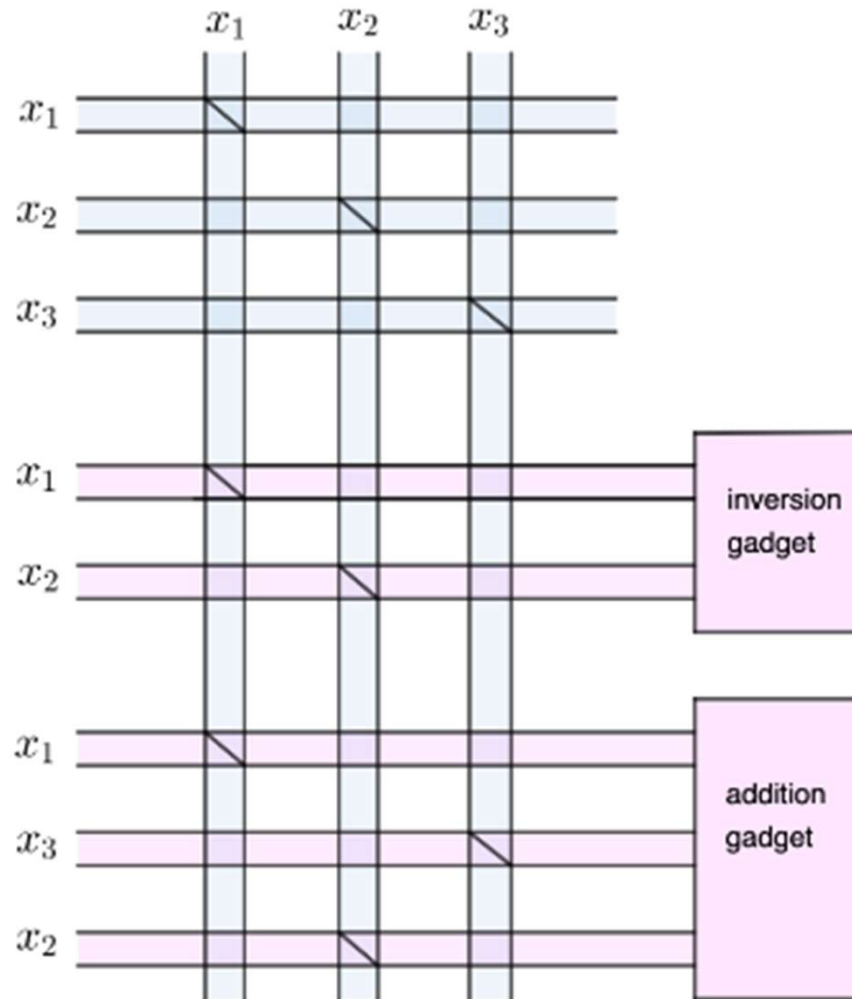
# The Flex Gadget



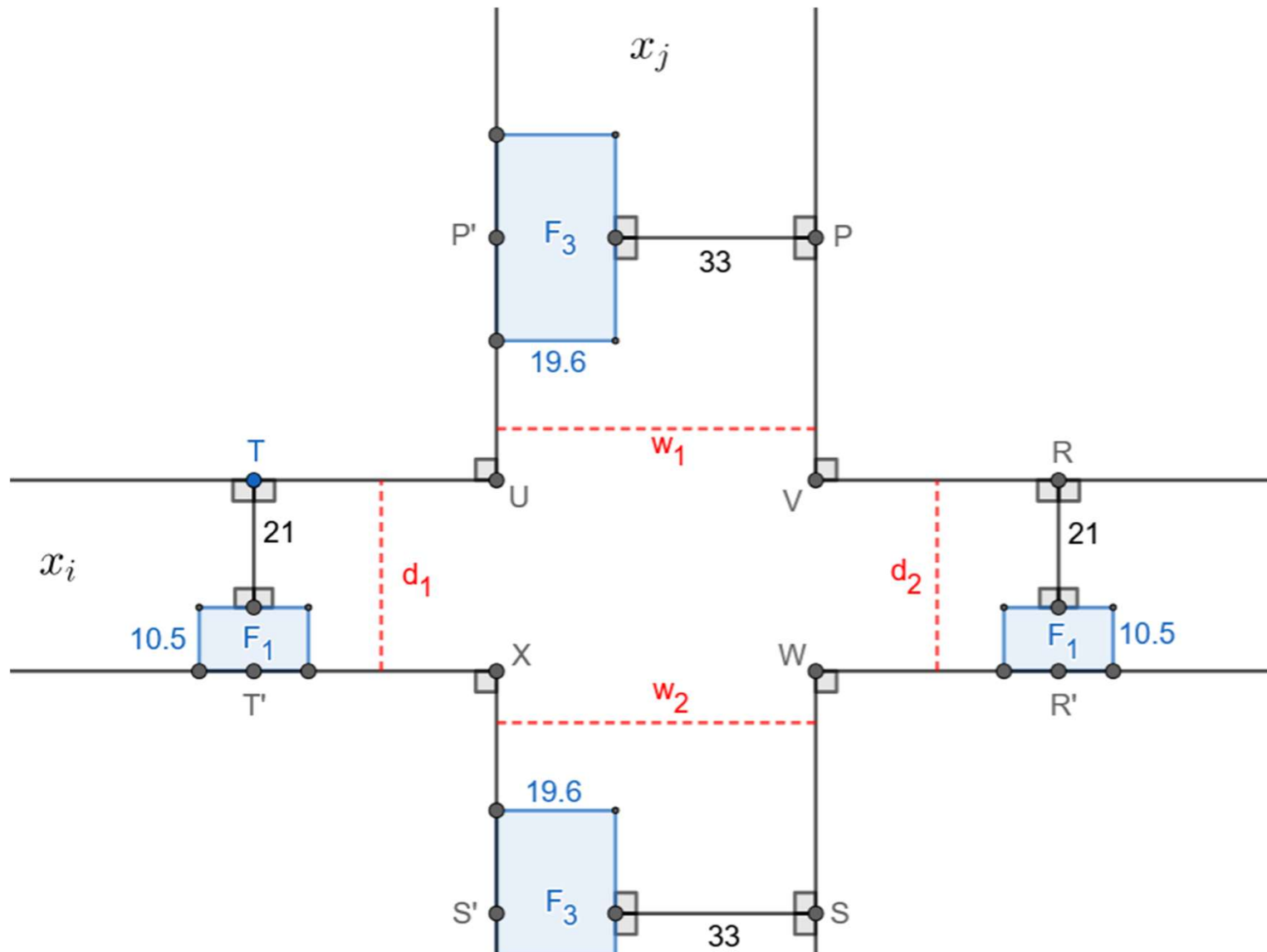
# The Variable Gadget



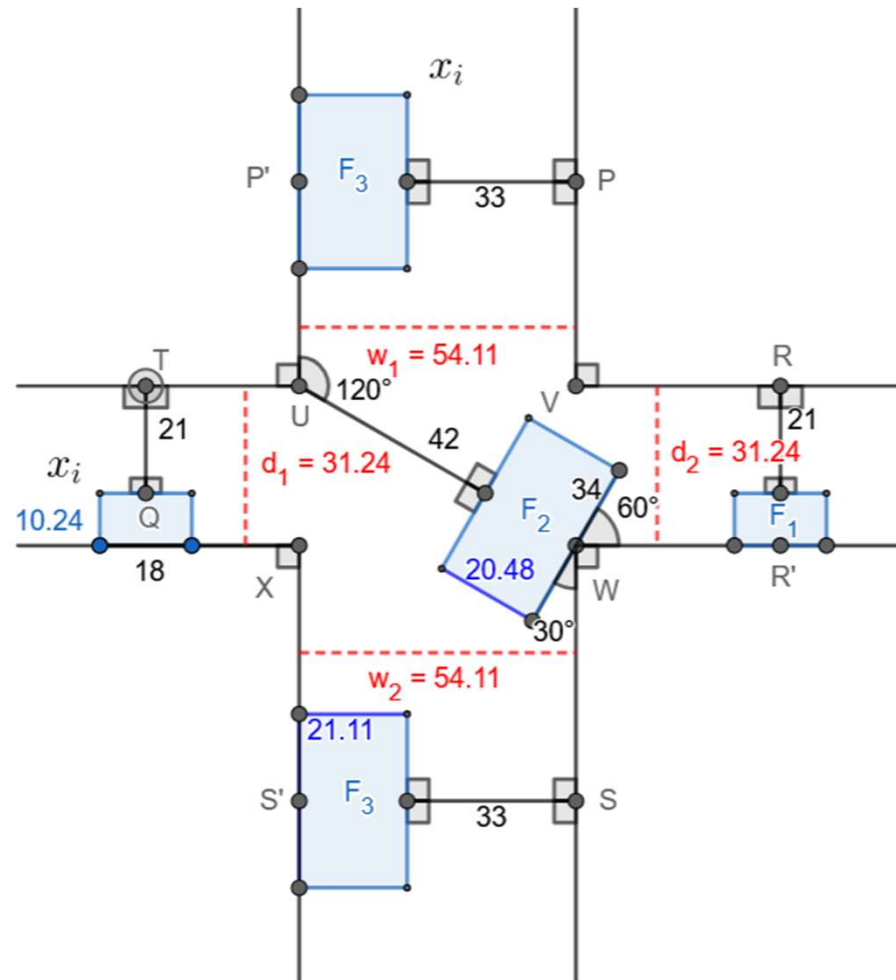
# Construction Overview



# Cross-Over Gadget I

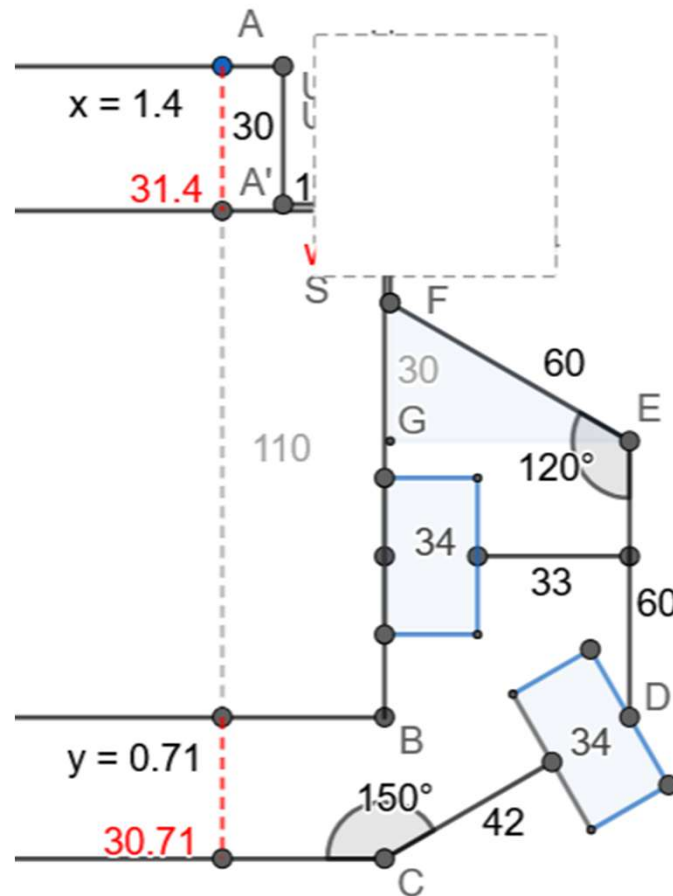


# Cross-Over Gadget II



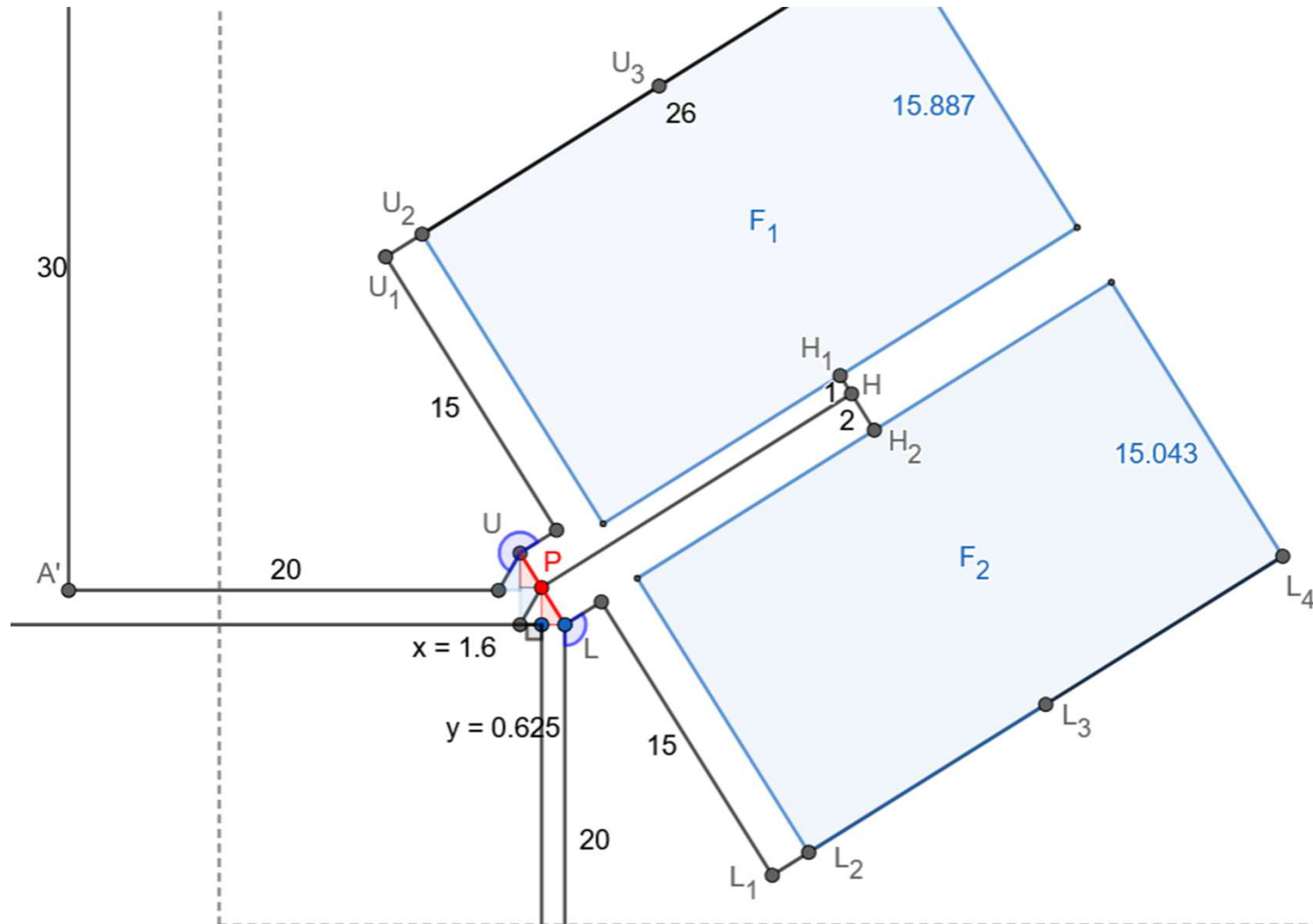


# Inversion Gadget I





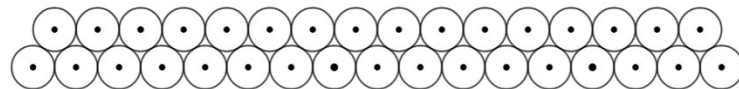
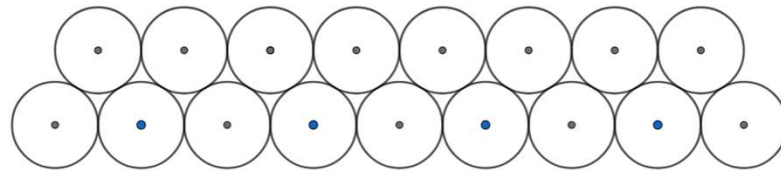
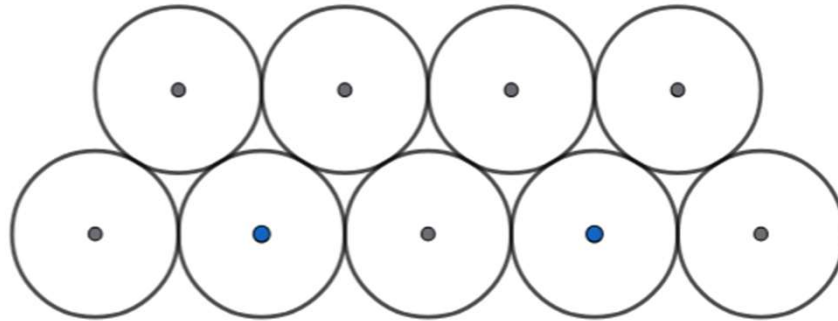
# Inversion Gadget III



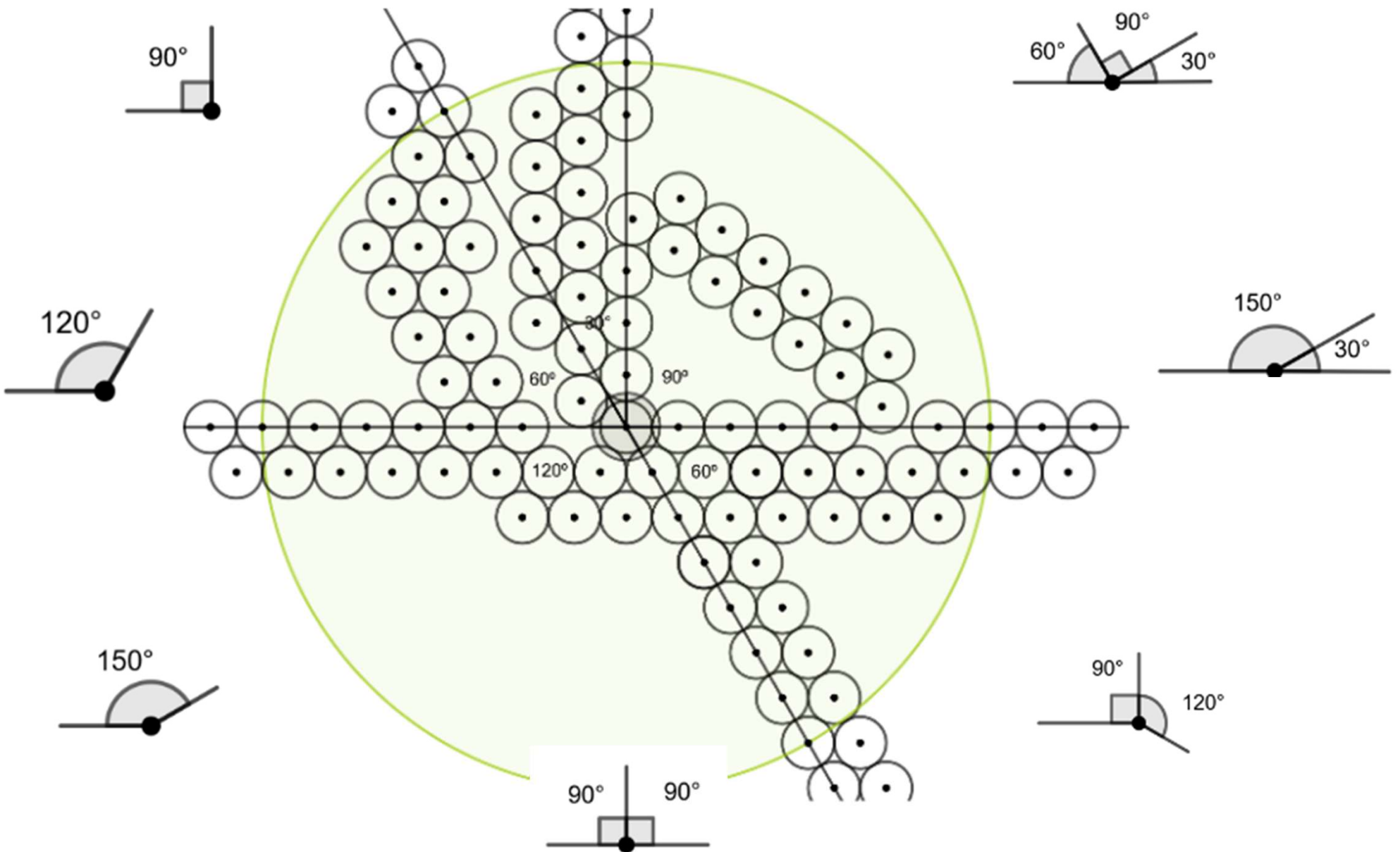
**STEP 2**

**LINKAGES  $\rightarrow$  PENNY GRAPHS**

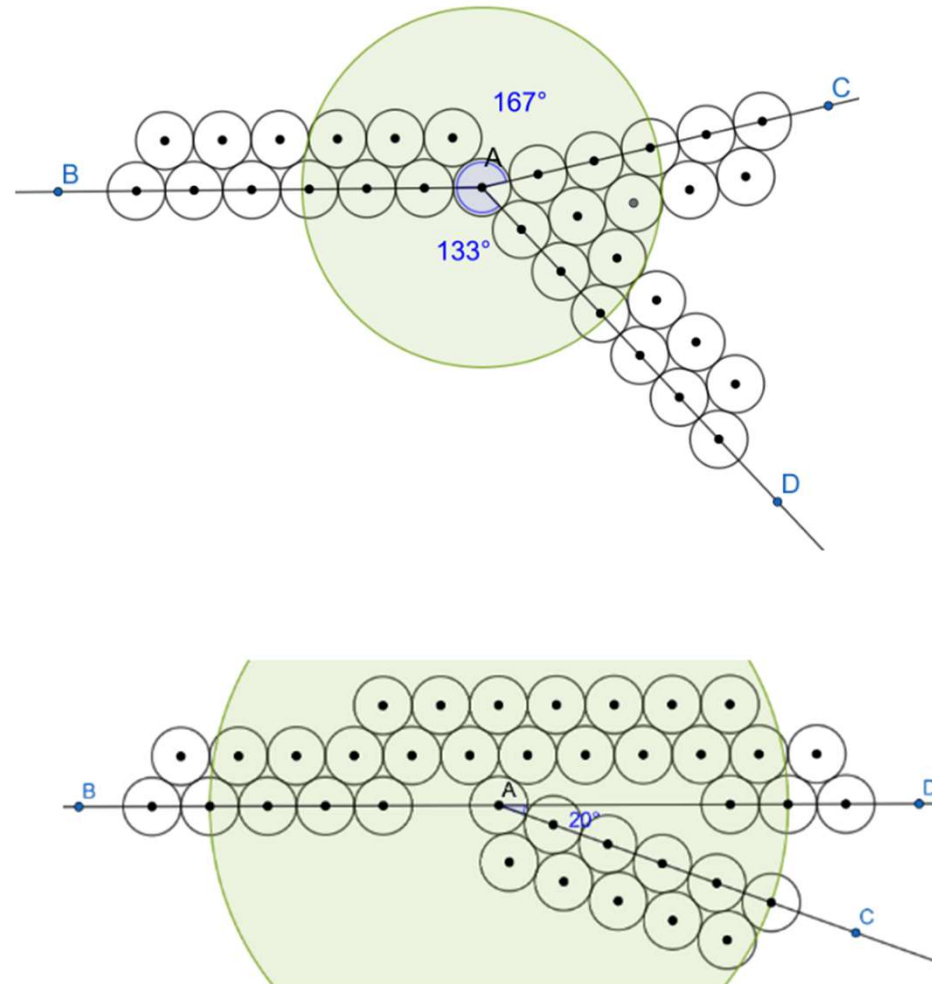
# Bars



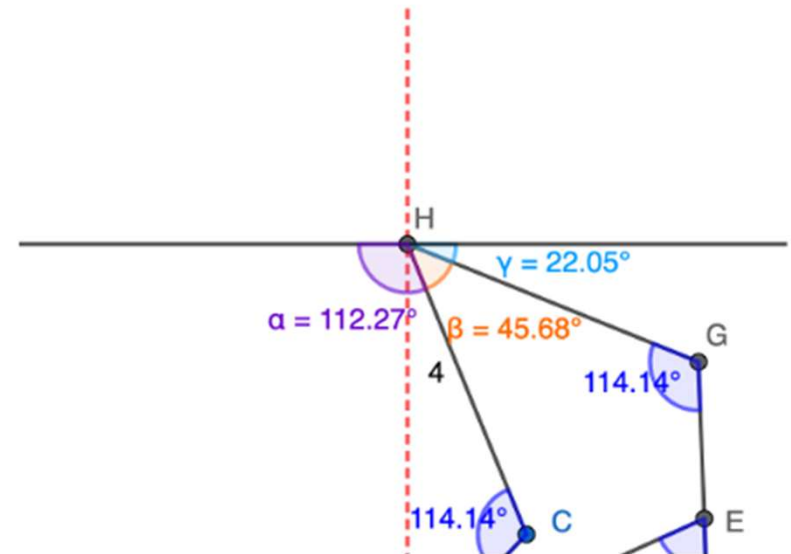
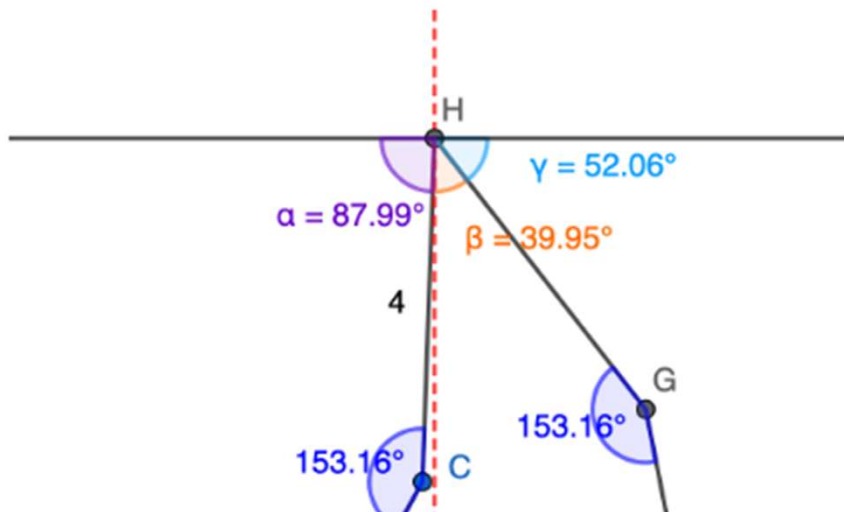
# Fixed Angle Vertices



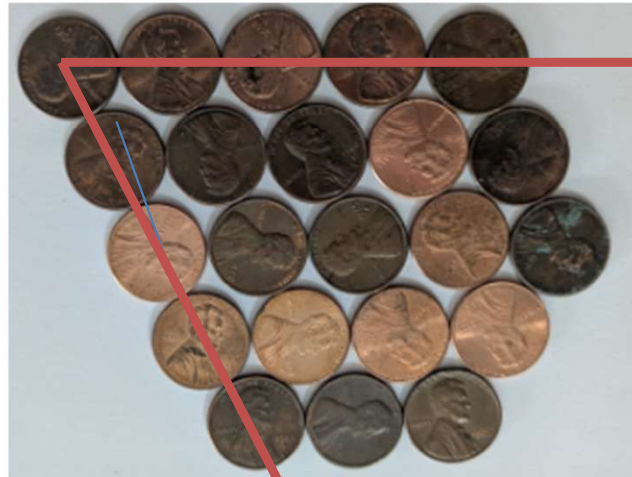
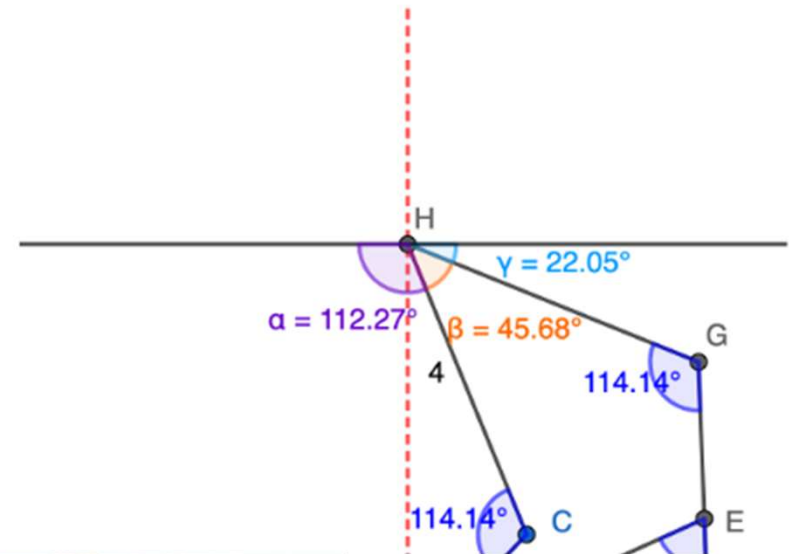
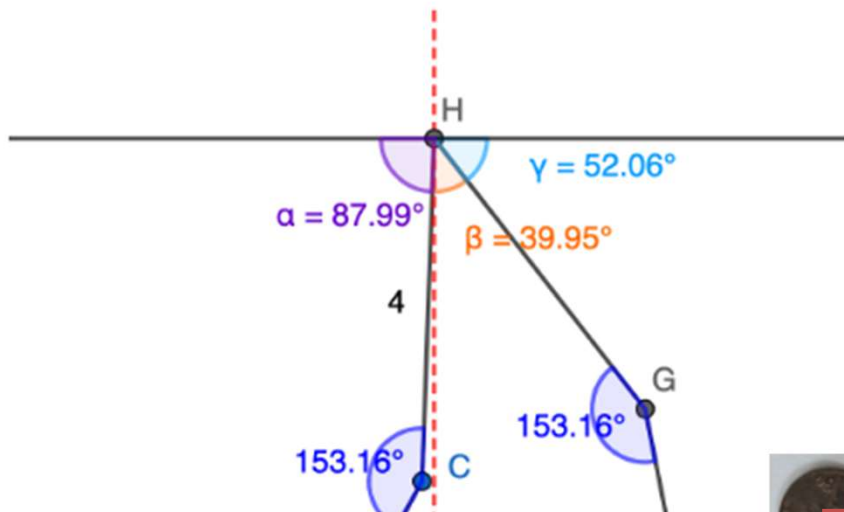
# Flexible Angle Vertices I



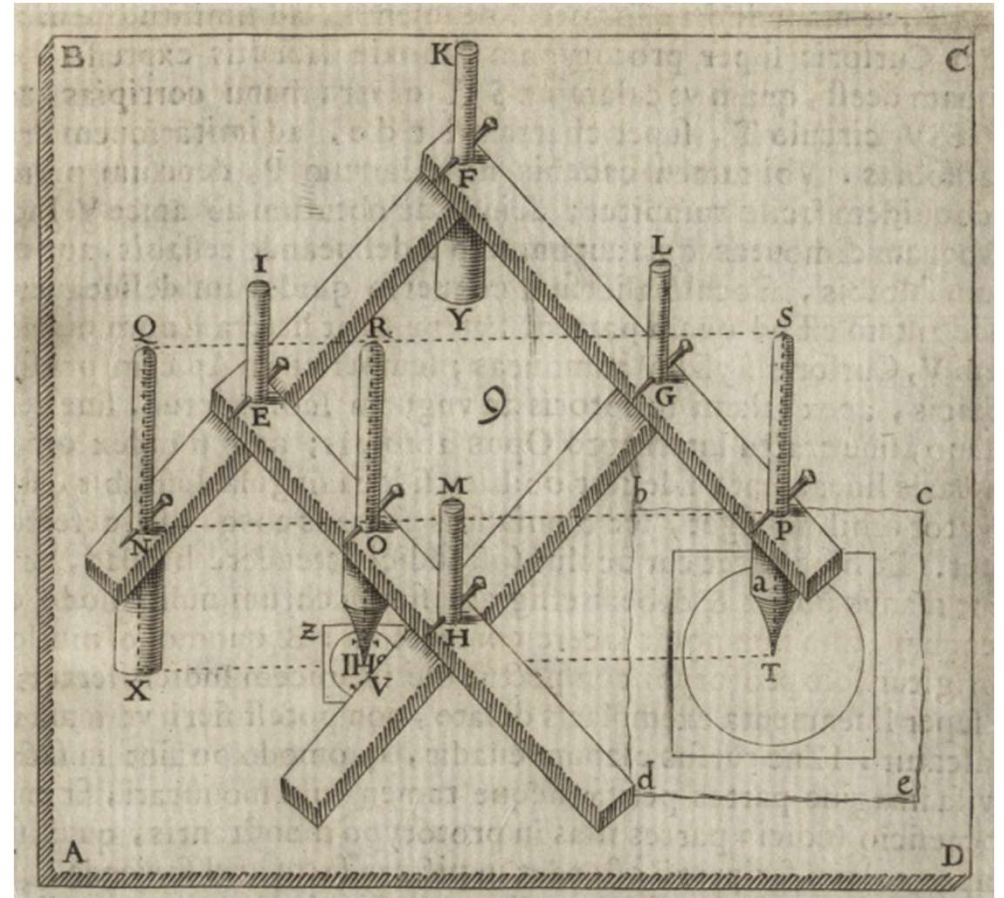
# Flexible Angle Vertices II



# Flexible Angle Vertices II

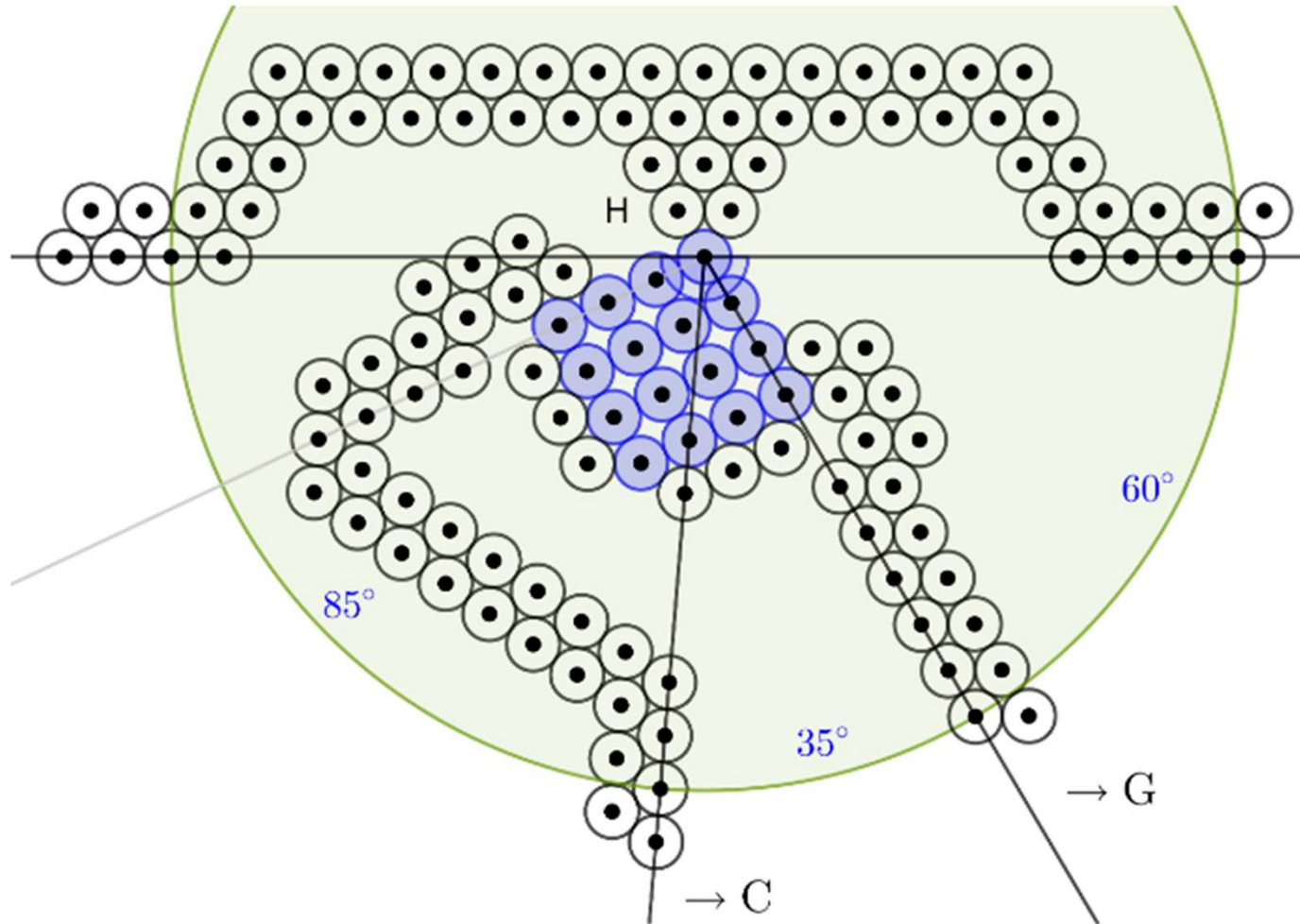


# Flexible Angle Vertices II.V



Christoph Scheiner, *Pantographice*, 1636  
<https://catalog.hathitrust.org/Record/100877903>

# Flexible Angle Vertices III



# Rigidity

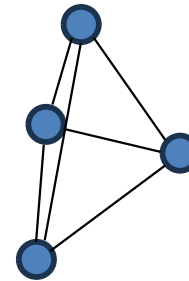


## Theorem

Testing rigidity of a penny graph configuration is  $\forall \mathbb{R}$ -complete.

# Marble Graphs

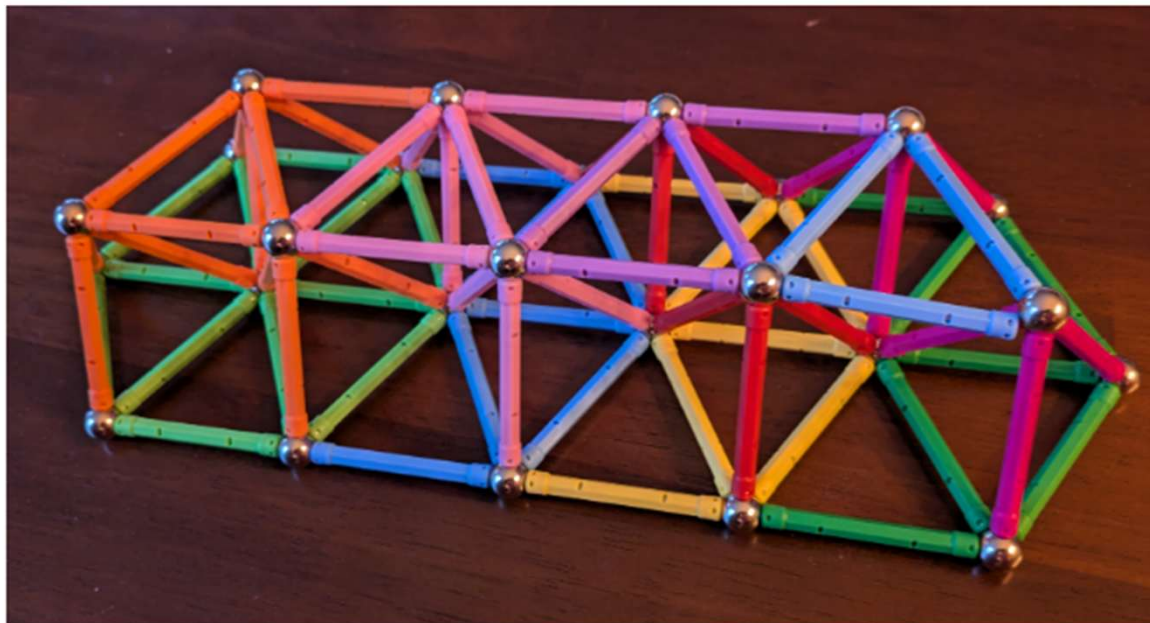
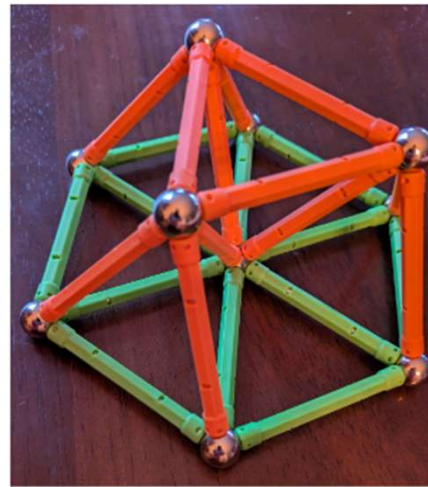
$K_4$



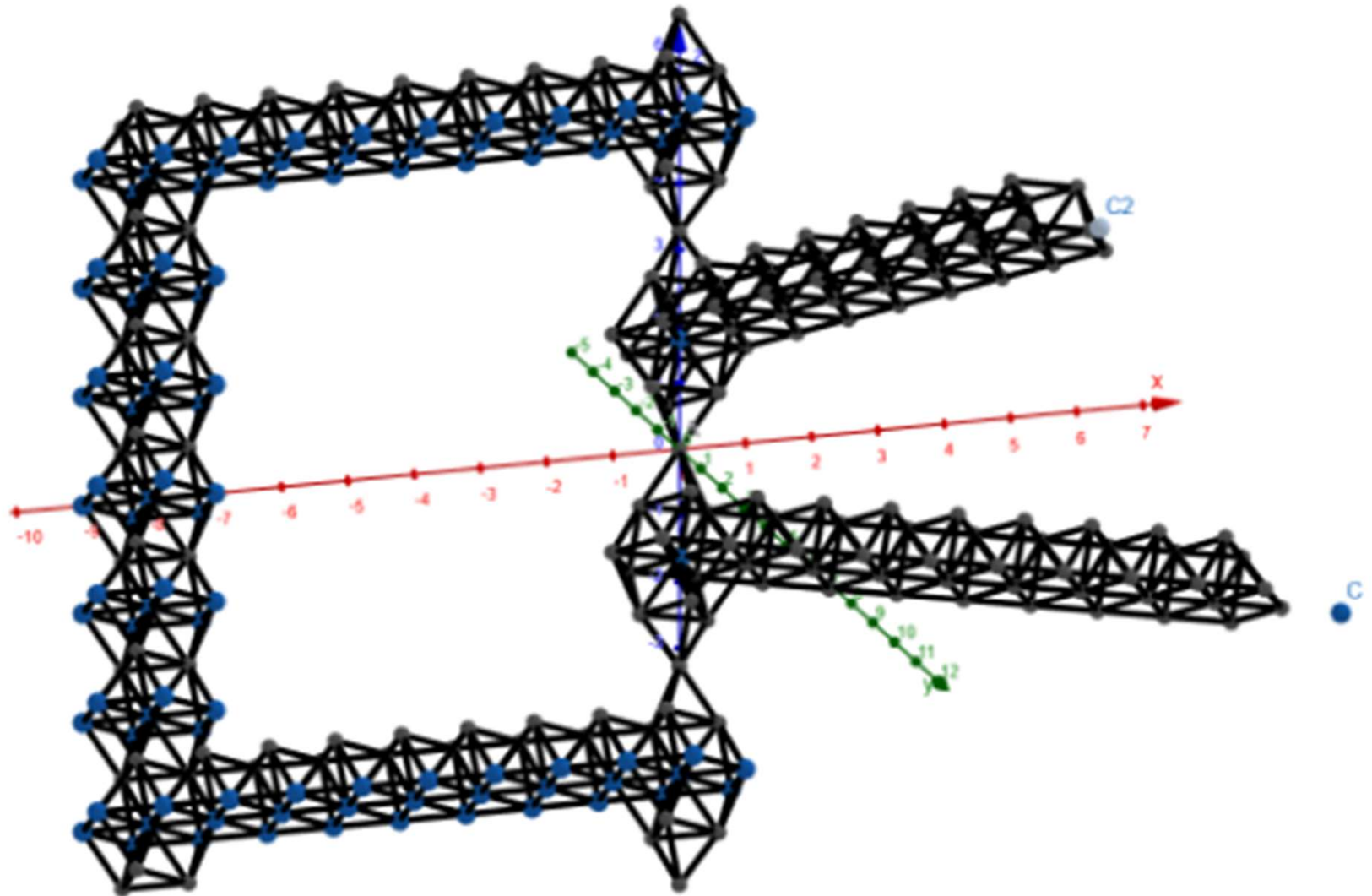
**Theorem (Lubiw, Schaefer, 2025)**

Recognizing marble graphs is  $\exists \mathbb{R}$ -complete.

# Pennies → Marble Gadgets I



# Pennies → Marble Gadgets II



# Contacts in Higher Dimensions

dim	unit ball contact graphs	ball contact graphs
2	$\exists \mathbb{R}$ -complete	P
3	$\exists \mathbb{R}$ -complete	$\exists \mathbb{R}$ -complete
4	NP-hard (Hliněný, 1997)	$\exists \mathbb{R}$ -complete
5		NP-hard
8	NP-hard (Hliněný, Kratochvíl, 2001)	
9		NP-hard
24	NP-hard (Hliněný, Kratochvíl, 2001)	
25		NP-hard

**Proposition (Kirkpatrick, Rote)**

$G$  unit ball contact graph in  $\mathbb{R}^d$   
iff

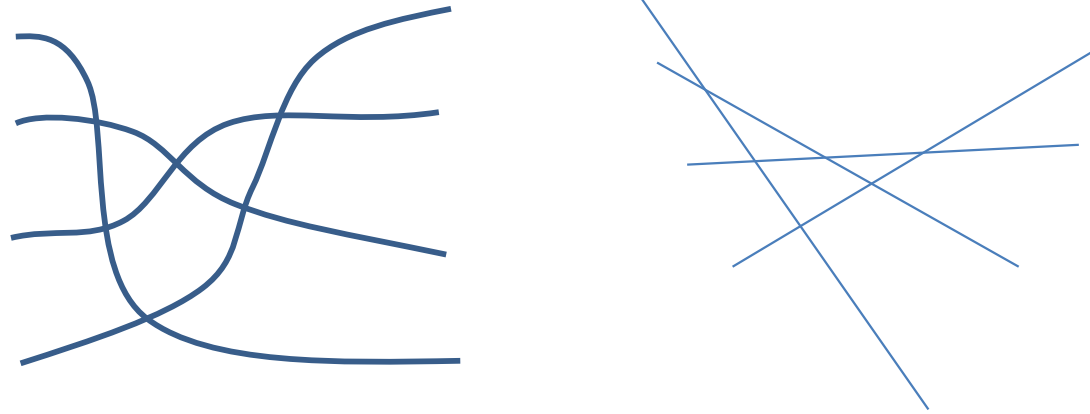
$G + K_2$  ball contact graph in  $\mathbb{R}^{d+1}$

# The Dark Side

$$\exists x, y, z: x^2 = x \wedge y^2 = y \wedge x < y \wedge z^2 = y + y$$

$$\begin{aligned} \exists x_1, \dots, x_n: \quad & 0 < x_1 < \frac{1}{2} \\ & \wedge 0 < x_2 < x_1^2 \wedge \\ & \quad \dots \\ & \wedge 0 < x_n < x_{n-1}^2 \end{aligned}$$

# Universality



## **Theorem (Mnëv, 1988, also Shor, 1991)**

Every semialgebraic set is “stably equivalent”  
to the realization space of an arrangement.

or Matoušek, 2014 !

# Precision and Grids

## Theorem

Penny graphs of order  $n$  which are trees can be realized on a grid of size  $2^{2n^k} \times 2^{2n^k}$  for constant  $k > 0$ .

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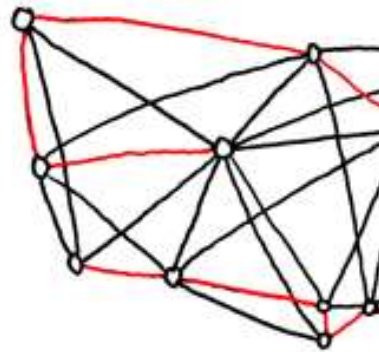
True for bipartite graphs?

Thank You

**WHAT ABOUT EUCLIDEAN TSP, MINIMUM  
WEIGHT TRIANGULATION, ETC?**

# Euclidean Travelling Salesman

**Theorem (Garey, Graham, Johnson, 1976)**



is NP-hard.

NP-hard ?

# The Sum of Square Roots

$$\sqrt{3} + \sqrt{5} \stackrel{?}{<} \sqrt{7}$$

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$$\sqrt{3} + \sqrt{5} + \sqrt{8} + \sqrt{12} + \sqrt{13} + \sqrt{14} \stackrel{?}{<} \sqrt{6} + \sqrt{10} + \sqrt{15} + \sqrt{16} + \sqrt{17}$$

# The Sum of Square Roots

$$\sqrt{3} + \sqrt{5} \stackrel{?}{<} \sqrt{7}$$

$$\sqrt{3} + \sqrt{5} + \sqrt{8} + \sqrt{12} + \sqrt{13} + \sqrt{14} \stackrel{?}{<} \sqrt{6} + \sqrt{10} + \sqrt{15} + \sqrt{16} + \sqrt{17}$$

17.60785618719

17.60785637477

# The Sum of Square Roots

$$\sqrt{3} + \sqrt{5} \stackrel{?}{<} \sqrt{7}$$

$$\sqrt{3} + \sqrt{5} + \sqrt{8} + \sqrt{12} + \sqrt{13} + \sqrt{14} \stackrel{?}{<} \sqrt{6} + \sqrt{10} + \sqrt{15} + \sqrt{16} + \sqrt{17}$$

17.60785618719

17.60785637477

# The Sum of Square Roots

$$\sqrt{3} + \sqrt{5} + \sqrt{8} + \sqrt{12} + \sqrt{13} + \sqrt{14} < \sqrt{6} + \sqrt{10} + \sqrt{15} + \sqrt{16} + \sqrt{17}$$

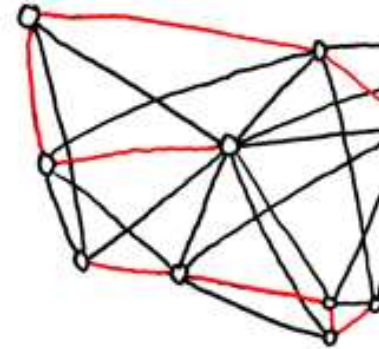
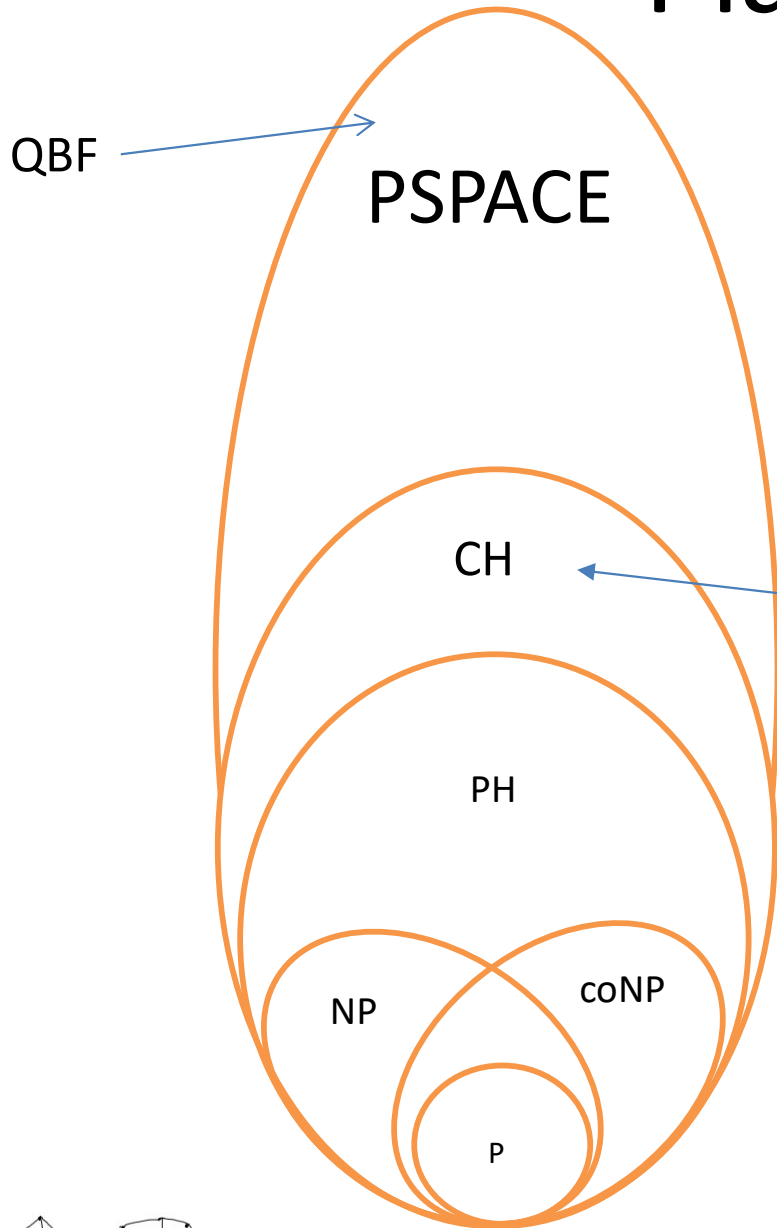
$$r(n, k) := \min \left| \sum_{i=1}^k \sqrt{a_i} - \sum_{i=1}^k \sqrt{b_i} \right|$$

nonzero,  $a_i, b_i \leq n$

$$\Omega(2k \lg n) \leq -\lg r(n, k) \leq O(2^{2k} \lg n)$$

<http://maven.smith.edu/~orourke/TOPP/P33.html>

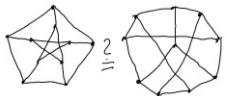
# Placing SSQRT



in  $NP^{SSQRT}$

SSQRT

Allender, Burgisser, Kjeldgaard-Pedersen, Miltersen  
On the Complexity of Numerical Analysis, 2008



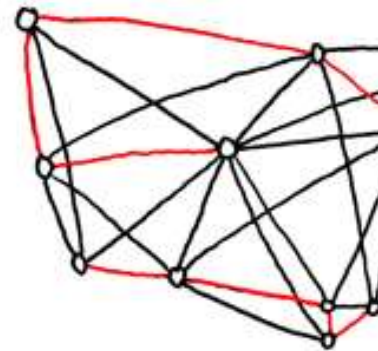
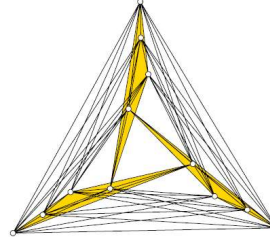
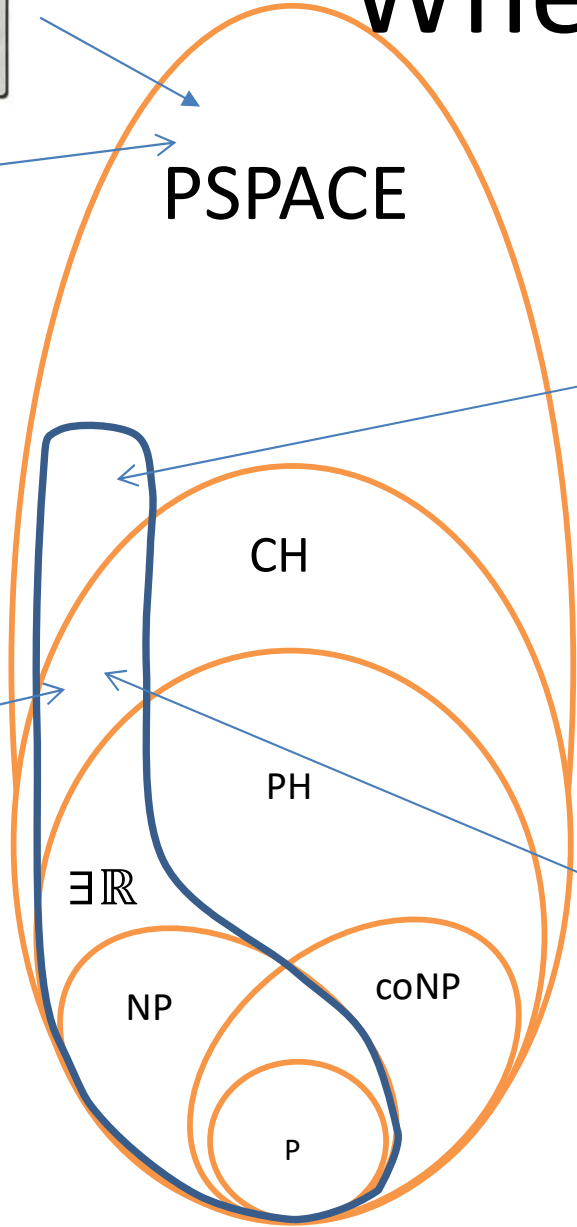
# Where is $\exists\mathbb{R}$ ?



QBF

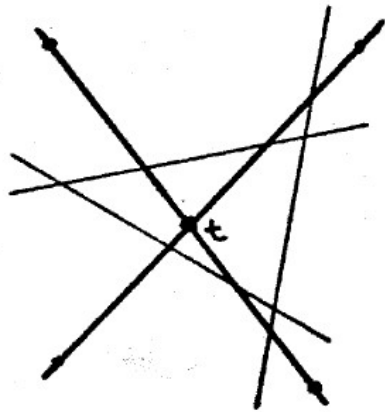
PSPACE

SSQRT



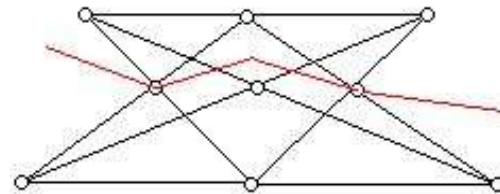
# A Subtlety

$\exists_{<}\mathbb{R}$



- rcr
- segment intersection

$\exists_{=}\mathbb{R}$



- Nash equilibrium
- Steinitz problem
- Euclidean dimension

**Theorem (S, Štefankovič, 2017)**

$$\exists_{<}\mathbb{R} = \exists_{=}\mathbb{R}$$