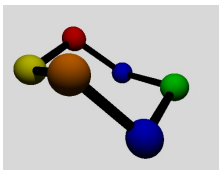


Euclidean Embedding of Rigid Graphs

Ioannis Z. Emiris

University of Athens

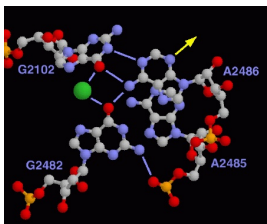


ACAC-2010

Outline

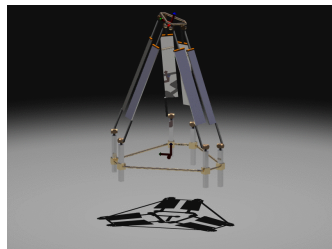
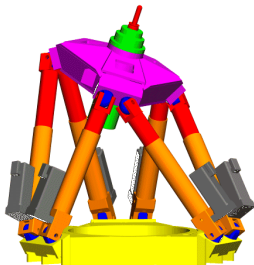
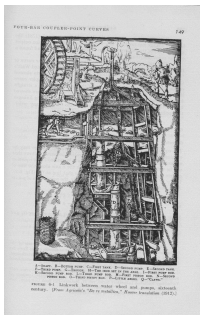
- 1 Motivation
- 2 Rigidity
- 3 Embeddings
 - Planar embeddings
 - Algebraic formulation
 - Distance geometry
 - Spatial embeddings
- 4 Further questions

Bioinformatics



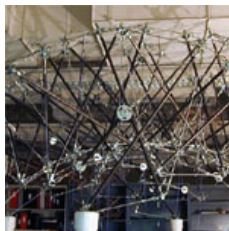
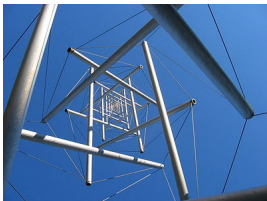
- NMR spectroscopy yields (approximate) distances, hence 3d structure, in solution [K.Wüthrich, ETHZ, Chemistry Nobel'02]
- X-ray crystallography: more accurate distances but in crystal state, which takes ~ 1 year.
- Software for ≥ 100 atoms:
 Dyana [Güntert,Mumenthaler,Wüthrich'97],
 Embed [Crippen,Havel'88], Disgeo [Havel,Wuthrich'98],
 Dgsol [Moré,Wu], Abbie [Hendrickson], etc

Robotics



Engineering

- Architecture, tensegrity



- Topography (Surveyors)



Problem definition

Embed- \mathbb{R}^d : Find a **function** which maps vertices to points $\in \mathbb{R}^d$ so as to preserve the given (Euclidean) distances, $d \geq 1$.

Counting: Given a rigid graph, determine max #embeddings in \mathbb{R}^d (modulo rigid motions), assuming **generic** edge lengths.

Rigid motions: translation, rotation.

Generic / Minimal Rigidity

- Graph G is **generically rigid** in \mathbb{R}^d iff for generic edge lengths it has a finite number of embeddings in \mathbb{R}^d , modulo rigid motions.
- Graph G is **minimally rigid** iff it becomes non-rigid (flexible) once an edge is removed.

We call generically minimally rigid graphs simply **rigid**.

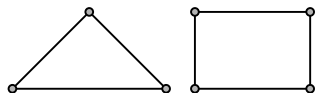


Figure: A rigid vs a non-rigid (flexible) graph in \mathbb{R}^2 .

Rigidity Condition

Theorem (Maxwell:1864,Laman'70)

Graph $G = (V, E)$ is rigid in \mathbb{R}^2 iff:

- $|E| = 2|V| - 3$, and
- $|E'| \leq 2|V'| - 3$, \forall vertex-induced subgraph (V', E') .

This is the (combinatorial) “Laman condition” for rigidity in \mathbb{R}^2 .

Henneberg steps

Adding a vertex while preserving rigidity:

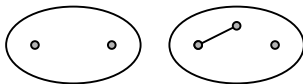


Figure: H_1 and H_2 steps

Henneberg steps

Adding a vertex while preserving rigidity:

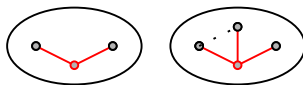


Figure: H_1 and H_2 steps

Henneberg steps

Adding a vertex while preserving rigidity:

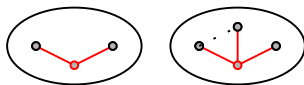


Figure: H_1 and H_2 steps



Figure: Examples for $n = 6$

Planar construction

Definition

A H_1 (resp. H_2) construction is a succession of H_1 (resp. H_1 and H_2) steps, which begins with a triangle.

Theorem (Henneberg, Whiteley-Tay)

Graph G is Laman iff it has a H_2 construction.

Rigidity in \mathbb{R}^3

Generalized condition: $|E| = 3|V| - 6$, $|E'| \leq 3|V'| - 6$.

Counterexample: Double Banana.

Theorem (Gluck,Aleksandrov)

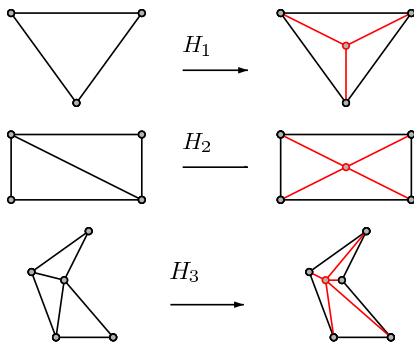
*The 1-skeleta of **simplicial** (convex) polyhedra are rigid in \mathbb{R}^3 .*

Notice they satisfy $|E| = 3|V| - 6$, $|E'| \leq 3|V'| - 6$.

Open: Complete characterization; other classes.

3 Henneberg steps in \mathbb{R}^3

H_1, H_2, H_3 steps replace $k - 1$ diagonals in $(k + 2)$ -cycle, by new vertex and $k + 2$ edges, for $k = 1, 2, 3$:



Henneberg construction in \mathbb{R}^3

A **H_3 construction** is a succession of H_1, H_2, H_3 steps, starting at the 3-simplex (tetrahedron), or K_4 graph.

Theorem (Bowen-Fisk'67)

A graph is the 1-skeleton of a simplicial polyhedron in \mathbb{R}^3 iff it admits a H_3 construction.

Embedding complete graphs

- Consider (unknown) points $p_0, \dots, p_n \in \mathbb{R}^d$, and given distances

$$d_{ij}^2 = |p_i - p_j|^2, \quad d_{i0}^2 = |p_i|^2, \quad \text{by setting } p_0 = 0.$$

- Now define (Gram) matrix G as follows:

$$d_{ij}^2 = |p_i|^2 - 2p_i^T p_j + |p_j|^2 \Leftrightarrow p_i^T p_j = \frac{d_{i0}^2 - d_{ij}^2 + d_{j0}^2}{2} =: G_{ij},$$

hence $G = [p_1, \dots, p_n]^T \cdot [p_1, \dots, p_n]$.

- The Singular Value Decomposition yields

$$G = V \Sigma V^T \Rightarrow P = \sqrt{\Sigma} \cdot V^T.$$

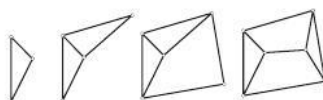
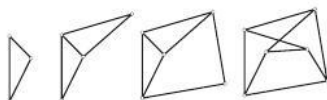
Decision problem

- Given **complete** set of exact distances: $\text{Embed-}\mathbb{R}^d \in \text{P}$.
- Given **incomplete** set of exact distances [Saxe'79].
 $\text{Embed-}\mathbb{R} \in \text{NP-hard}$. Reduction of set-partition.
 $\text{Embed-}\mathbb{R}^k \in \text{NP-hard}$, for $k \geq 2$, even if weights $\in \{1, 2\}$.
- (Approximate) $\text{Embed-}\mathbb{R}^2 \in \text{NP-hard}$ for planar rigid graphs with all weights = 1 [Caballo, Demaine, Rote'03]
- Given distances $\pm\epsilon$, $\text{approximate-Embed-}\mathbb{R}^d \in \text{NP-hard}$ [Moré, Wu'96].
- Every graph with n vertices can be embedded in *some* Euclidean space (*of any dimension*) with distortion in $O(\log n)$ [Bourgain'93].

Counting Planar Embeddings

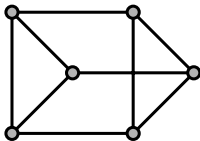
Construct all non-isomorphic graphs:

$n =$	3	4	5	6
#graphs	1	1	3	
upper bound	2	4	8	24
lower bound	2	4	8	24
H_1 sequence	Δ	$\Delta 1$	$\Delta 11$	$\Delta 111$
H_2 sequence				$\Delta 112$

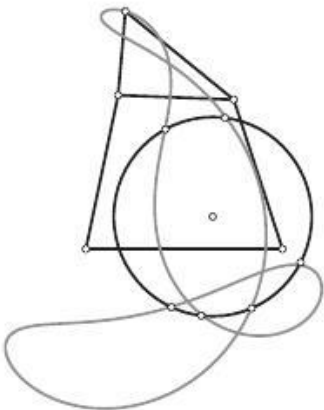


Small cases

- The triangle (Δ) has exactly 2 embeddings (reflections).
- H_1 **exactly doubles** the generic #embeddings (2 circles).
Open: Does H_2 at most quadruple #embeddings?
- $n = 6$: H_2 graphs:
 $K_{3,3}$ has 16 embeddings [Walter-Husty'07]
 Desargues' graph has 24 [Hunt'83] [Gosselin,Sefrioui,Richard'91]
 (aka 3-prism, planar parallel robot)



Desargues graph: lower bound

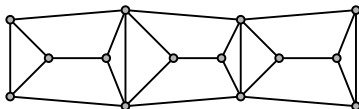


[Borcea, Streinu'04]

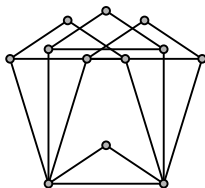
Lower Bounds in \mathbb{R}^2

[Borcea, Streinu'04]

- **Caterpillar Desargues** has $24^{n/4} \simeq 2.21^n$ embeddings.



- **Desargues fan** has $2 \cdot 12^{n/3-1} \simeq 2.29^n/6$ embeddings.



Smallest case is $n = 9$, yields 288.

Algebraic upper bounds

#embeddings = #solutions $\in \mathbb{R}^{nd}$ of a **polynomial system**, corresponding to edges E and $\binom{d+1}{2}$ “pin-down” equations:

$$\text{in } \mathbb{R}^2 : \begin{cases} x_1 = y_1 = 0, \\ y_2 = 0, \\ (x_i - x_j)^2 + (y_i - y_j)^2 = l_{ij}^2, & (i, j) \in E. \end{cases}$$

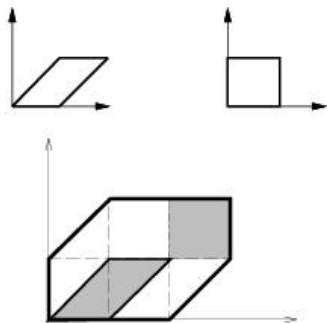
$$\text{in } \mathbb{R}^3 : \begin{cases} x_1 = y_1 = z_1 = 0, \\ y_2 = z_2 = 0, \\ z_3 = 0, \\ (x_i - x_j)^2 + (y_i - y_j)^2 + (z_i - z_j)^2 = l_{ij}^2, & (i, j) \in E. \end{cases}$$

Use **bounds** in \mathbb{C}^{nd} :

- classical, Bézout ($= \prod$ degrees),
- sparse, mixed volume (of exponents of nonzero terms).

Example

System $c_{11} + c_{12}xy + c_{13}x^2y + c_{14}x$, $c_{31} + c_{32}y + c_{33}xy + c_{34}x$,
with Newton polytopes:



has Mixed Volume = 3 = $V(P_1 + P_2) - V(P_1) - V(P_2)$.

General Upper Bound

- Bézout: $\Theta(2^{nd})$.
- [Borcea-Streinu'04] by distance matrices:

$$\prod_{k=0}^{n-d-2} \frac{\binom{n-1+k}{n-d-1-k}}{\binom{2k+1}{k}} \approx 2^{nd},$$

$$\binom{2n-4}{n-2} \approx \frac{4^{n-2}}{\sqrt{\pi(n-2)}}, \quad d=2,$$

Planar Upper Bound

- Mixed volume = 4^n [Steffens-Theobald'08]
- Sparseness A Laman graph, $n \geq 8$, with k degree-2 vertices has [E-Tsigaridas-Varvitsiotis'09]

$$\leq 2^{k+1} 4^{n-k-5} \text{ embeddings.}$$

Desargues graph: upper bound

[Collins'02]: Planar quaternion $q = q(d, \theta) \in \mathbb{R}^4$,

$$\text{transformation } M = \begin{bmatrix} q_4^2 - q_3^2 & -2q_3q_4 & 2q_1q_4 - 2q_2q_3 \\ 2q_3q_4 & q_4^2 - q_3^2 & 2q_1q_3 + 2q_2q_4 \\ 0 & 0 & 1 \end{bmatrix}$$

- $q_3^2 + q_4^2 = 1$, $|(Mv_i)^T v_j| - d_{ij}^2 = \text{hom}(q_i) - c = 0$: **MV = 12**.
- Equivalent: $\text{hom}(q_i) = c(q_3^2 + q_4^2)$, dehomogenize $z_i = q_i/q_4$.
- First equation is $z_3^2 + 1 = z_0$, system has **MV=6**.

Small cases

$n =$	3	4	5	6	7	8	9	10
upper	2	4	8	24	56	128	512	2048
lower	2	4	8	24	48	96	288	576
H_1	Δ	$\Delta 1$	$\Delta 11$	$\Delta 111$	$\Delta 1111$	$\Delta 11111$	$\Delta 1^6$	
H_2				$\Delta 112$	$\Delta 1112$	$\Delta 11112$	$\Delta 1^5 2$ $\Delta 1^4 21$ $\Delta 1^4 22$	

- Classified all isomorphic graphs by SAGE, applied Mixed volume on distance equations [E-Tsigaridas-Varvitsiotis:GD'09].
- For $n = 7$: upper bound by distance matrices (was 64).
 \exists graph with 56 complex roots; others with upper bound < 56

Distance matrix

A distance matrix M is square, $M_{ii} = 0$, $M_{ij} = M_{ji} \geq 0$.

It is **embeddable** in (Euclidean) \mathbb{R}^d iff

$$\exists \text{ points } p_i \in \mathbb{R}^d : M_{ij} = \frac{1}{2} \text{dist}(p_i, p_j)^2.$$

Distance geometry

Theorem (Cayley'41, Menger'28, Schoenberg'35)

M embeds in \mathbb{R}^d , for min d , iff Cayley-Menger (border) matrix has

$$\text{rank} \begin{bmatrix} 0 & 1 \cdots 1 \\ 1 & \\ \vdots & M \\ 1 & \end{bmatrix} = d + 2,$$

and, for any minor D indexed by rows/columns $0, i_1, \dots, i_k$,

$$(-1)^k D(i_1, \dots, i_k) \geq 0, \quad k = 2, \dots, d + 1.$$

Corollary

- For $k = 2$, $D(i, j) = 2M_{ij} \geq 0$,
- for $k = 3, 4$, we get the triangular/tetragonal inequalities.

Corollary

Points p_i embed in \mathbb{R}^d , for min d , iff corresponding Gram matrix $P^T P$ has rank d and is positive semidefinite (all eigenvalues ≥ 0).

Cyclohexane

$$\begin{array}{c}
 \\
 \\
 p_1 \\
 p_2 \\
 p_3 \\
 p_4 \\
 p_5 \\
 p_6
 \end{array}
 \begin{bmatrix}
 & p_1 & p_2 & p_3 & p_4 & p_5 & p_6 \\
 0 & 1 & 1 & 1 & 1 & 1 & 1 \\
 1 & 0 & u & c & x_{14} & c & u \\
 1 & u & 0 & u & c & x_{25} & c \\
 1 & c & u & 0 & u & c & x_{36} \\
 1 & x_{14} & c & u & 0 & u & c \\
 1 & c & x_{25} & c & u & 0 & u \\
 1 & u & c & x_{36} & c & u & 0
 \end{bmatrix}$$

Known $u = 1.526\text{\AA}$ (adjacent), $\phi \simeq 110.4^\circ \Rightarrow c \simeq 2.29\text{\AA}$ (triangle)

Rank = 5 \Leftrightarrow vanishing of all 6×6 minors:

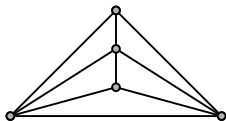
Yields a 3×3 **system** with Mixed volume = 16.

Embeddings in \mathbb{R}^3

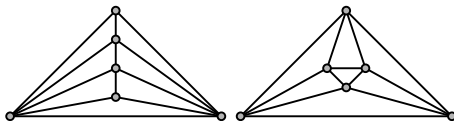
- The 3-simplex (tetrahedron, K_4) has exactly 2 embeddings: reflections about the plane.
- H_1 **exactly doubles** the generic #embeddings: 3 spheres intersect generically at 2 points.
Open: do H_2, H_3 multiply #embeddings by at most 4, 8?
- **Sparseness:** Consider $n \geq 6$, k degree-3 vertices. Then, there exist at most $2^{k+1}8^{n-k-5}$ embeddings [ETV'09].

Small Cases

$n = 5$: Unique graph, 4 embeddings (tight):



$n = 6$: 2 non-isomorphic graphs; RHS with 16 embeddings (tight):



Better mixed volumes

Mixed volume of distance equations in \mathbb{R}^3 is **loose** in \mathbb{C}^* .

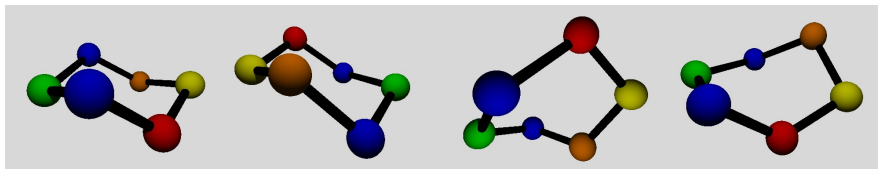
Pf. Bernstein's 2nd Thm [1975]

Remove spurious solutions with **new variables** s_i :

$$\begin{array}{ll}
 x_i = 0, & i = 1, 2, 3 \\
 y_i = 0, & i = 1, 2 \\
 z_i = 0, & i = 1 \\
 s_i = x_i^2 + y_i^2 + z_i^2, & i = 1, \dots, n \\
 s_i + s_j - 2x_i x_j - 2y_i y_j - 2z_i z_j = l_{ij}^2, & (i, j) \in E
 \end{array}$$

The case $n = 6$

- Mixed Volume (of new system) = 16.
- The cyclohexane has 16 real embeddings [E-Mourrain'99]
- The “jigsaw” parallel robot has 16 real configurations.

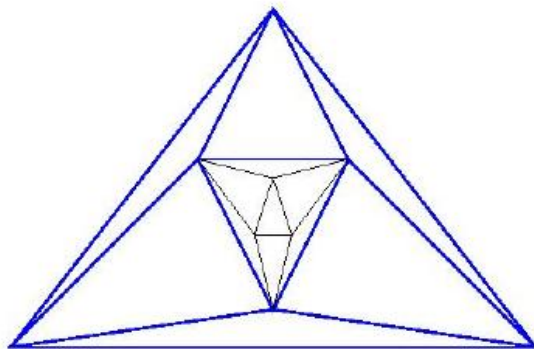


4 cyclohexanes (chairs, and boats/crowns) given 6 fixed distances and angles, or 12 distances.

Lower bound in \mathbb{R}^3

The **Cyclohexane caterpillar** has $\approx 16^{n/3} \simeq (2.52)^n$ embeddings.

Proof. Copies of Cyclohexanes with common triangle. For $n \geq 9$.



Small cases

$n =$	4	5	6	7	8	9	10
upper	2	4	16	32	160	640	2560
lower	2	4	16	32	64	256	512
H_1	Δ	$\Delta 1$	$\Delta 11$	$\Delta 111$	$\Delta 1^4$	$\Delta 1^5$	$\Delta 1^6$
H_2	—	—	$\Delta 12$	$\Delta 1^2 2$	$\Delta 1^3 2$	$\Delta 1^4 2$	$\Delta 1^5 2$
			$\Delta 1^2 2^2$	$\Delta 1^3 2^2$	$\Delta 1^4 2^2$		
			$\Delta 1^2 2 1$	$\Delta 1^3 2 1$	$\Delta 1^4 2 1$		
			$\Delta 1^2 2^3$	$\Delta 1^3 2^3$	$\Delta 1^3 2 1^2$		
						$\Delta 1^3 2 1 2$	
						$\Delta 1^3 2^2 1$	
						$\Delta 1^2 2^4$	

Using SAGE, and Mixed volumes [E-Tsigradas-Varvitsiotis:GD'09].

Matrix completion

Embedding is equivalent to **completing** a given incomplete matrix/graph so as to get a PSD Gram (or distance) matrix: It is expressed as **feasibility** of a PSD program.

Complexity:

- Solving PSD programs with arbitrary precision $\in P_{\mathbb{R}}$ (interior-point or ellipsoid algorithms).
- Unknown whether PSD-program $\in NP_{bit}$.
- Unknown whether PSD-feasibility $\in P_{bit}$ (weak poly-time).
- Recall: interior-point, ellipsoid algorithms for LP are in P_{bit} .

Chordal Graphs

- A graph is **chordal** if it contains NO empty cycle of length ≥ 4 .
- **Thm** [Grone,Sa,Johnson,Wolkowitz'84] [Bakonyi,Johnson'95]
Every partial distance matrix M with graph G has a distance-matrix completion iff G is chordal.
Proof: all principal submatrices embed \Rightarrow matrix embeds.
[\Leftarrow] algorithm in P [Laurent'98].
- **Thm** [Laurent] If #edges added to make G chordal is $O(1)$, then distance-matrix completion $\in P_{bit}$.
- Generally, minimizing #edges to make G chordal is NP-hard.

Complete subgraphs

- **Thm [Laurent]**. Suppose G contains no clique K_4 . Then, PSD-completion is in $P_{\mathbb{R}}$.
- Consider a clique missing edges incident to vertex v . Then, in poly-time, M is PSD-completed and its min embedding dimension (MED) computed [E-Fragoudakis-Markou], e.g:

$$\text{MED}(v - G_1 \equiv G_2) = \max\{\text{MED}(v - G_1), \text{MED}(G_1 \equiv G_2)\}.$$

- Same for star of cliques K_i : $\text{MED}(\text{star}) = \max_i\{\text{MED}(K_i)\}$.

Generalizations

Body-and-bar structures

Define graph by mapping bodies to vertices, bars to edges.

Structure is rigid in \mathbb{R}^d iff graph = edge-disjoint union of $\binom{d+1}{2}$ spanning trees [Tay'84]

Body-and-hinge and body-and-bar/hinge structures

Replace Hinge by $\binom{d+1}{2} - 1$ edges.

Same characterization of rigidity [Whiteley'88] [Tay'89]

Molecular Conjecture proven [Katoh-Tanigawa'09]

A graph corresponds to a rigid Body-and-hinge structure in \mathbb{R}^d iff it corresponds to a rigid Panel-and-hinge structure.

Open

- **Specific** embedding numbers, better lower bounds.
- Combinatorial **characterization** in \mathbb{R}^3 .
- Count embeddings of **body-and-bar**, **body-and-hinges** structures.
- How about other distance norms?
- Tensegrity

Thank you!