# Algebraic and combinatorial bounds on the embedding number of distance graphs 

Ioannis Emiris
"Athena" Research Center, and U. Athens
40th EuroCG, Ioannina, 15 March 2024


## Outline

## Definitions

Algebraic interlude

Graph orientations

Extensions

## Distance graphs



NMR yields distances, hence 3D structure, in solution [Wüthrich, Chemistry Nobel'02]

## Definitions

## Minimally generically rigid graphs

Study simple undirected weighted graphs $G$ : weights are distances.

- A Euclidean embedding $\rho: V \rightarrow \mathbb{R}^{d}$ of graph $G=(V, E, \lambda)$ respects edge lengths $\lambda_{u, v}=\|\rho(u)-\rho(v)\|,(u, v) \in E$.
- Complex embedding $\rho: V \rightarrow \mathbb{C}^{d}$ :
$\lambda_{u, v}=\|\rho(u)-\rho(v)\|,(u, v) \in E$.
- $G$ is (generically) rigid if the number of embeddings (for generic lengths) is finite modulo rigid transforms.
- $G$ is minimally rigid if $G \backslash\{e\}, \forall e \in E$, is not rigid (flexible).


## Rigid vs flexible graphs



Construction of minimally rigid graphs

$K_{3,3}$
Desargues

## Cyclohexane



Given 6 distances and angles, or 12 distances (Laman count).
Algebraic bound $=16$ : tight in $\mathbb{R}^{3}$.
4 conformations in nature [E,Mourrain'99:Algorithmica]

## Edge count

## Theorem (Maxwell:1864)

If $G=(V, E)$ is generically minimally rigid, and $|V|=n$, then

- $|E|=d \cdot n-\binom{d+1}{2}$, and
- $\left|E^{\prime}\right| \leq d \cdot\left|V^{\prime}\right|-\binom{d+1}{2}$, $\forall$ vertex-induced subgraph $\left(V^{\prime}, E^{\prime}\right)$.
[Pollaczek-Geiringer] [Laman'70]
Equivalence in $d=2$, and
$d=3$ for simplicial polytopes [Gluck'75]
No equivalence generally in $d=3$ :
Double banana, $n=8,|E|=18$.


Further question: count / enumerate the embeddings.

## Small cases in $\mathbb{R}^{2}$

- The triangle has 2 embeddings (reflections).
- $n=6$ : two "nontrivial" $\left(H_{2}\right)$ graphs:
- $K_{3,3}$ has 16 embeddings [Walter-Husty'07]
- Desargues' graph has 24 (3-prism, planar parallel robot) [Hunt'83] [Gosselin,Sefrioui,Richard'91] [Borcea,Streinu'04]



## $n=7: 56$ conformations in $\mathbb{R}^{2}[\mathrm{E}$, Moroz'11]



## Algebraic formulation

\#embeddings = \#solutions of a polynomial system expressing edge lengths, and $\binom{d+1}{2}+1$ constraints to fix the graph, remove scaling

$$
\begin{aligned}
& \text { in } \mathbb{R}^{2}:\left\{\begin{array}{l}
x_{1}=y_{1}=0, \\
x_{2}=1, y_{2}=0, \\
\left(x_{i}-x_{j}\right)^{2}+\left(y_{i}-y_{j}\right)^{2}=\lambda_{i j}^{2}, \quad(i, j) \in E .
\end{array}\right. \\
& \text { in } \mathbb{R}^{3}:\left\{\begin{array}{l}
x_{1}=y_{1}=z_{1}=0, \\
x_{2}=1, y_{2}=z_{2}=0, \\
z_{3}=0, \\
\left(x_{i}-x_{j}\right)^{2}+\left(y_{i}-y_{j}\right)^{2}+\left(z_{i}-z_{j}\right)^{2}=\lambda_{i j}^{2}, \quad(i, j) \in E .
\end{array}\right.
\end{aligned}
$$

## Enumeration problem

- \#complex embeddings bounds \#Euclidean embeddings. Usually equal, exception is the Jackoson-Owen graph

- Bézout's (trivial) bound on quadratic system implies $O\left(2^{d n}\right)$.


## Enumeration: lower bounds

- ... on real embedding numbers: $\Omega\left(2.381^{n}\right)$ for $\mathbb{R}^{2}$, $\Omega\left(2.639^{n}\right)$ for $\mathbb{R}^{3}$ [Bartzos,E,Legersky,Tsigaridas'21]
- ... on complex embedding numbers: $\Omega\left(2.507^{n}\right)$ for $\mathbb{C}^{2}$, $\Omega\left(3.067^{n}\right)$ for $\mathbb{C}^{3}$ [Grasegger et al.'20].



## Enumeration: upper bounds

- Determinantal varieties [Harris,Tu'84]
- Determinantal variety on distance matrices [Borcea,Streinu'04]
- Mixed volume of Newton polytopes
[Steffens, Theopald'10] ignores roots at (toric) infinity:
$X_{i 1}^{2}+X_{i 2}^{2}=s_{i}, s_{i}+s_{j}-2 X_{i 1} X_{j 1}-2 X_{i 2} X_{j 2}=\lambda_{i j}^{2}$.
No asymptotic improvement on Bézout's.
- First improvement for $d \geq 5$ [Bartzos,E,Schicho'20] using multi-homogeneous Bézout and permanents.
- State of art: First improvement for all $d$ by graph orientations [Bartzos,E,Vidunas'21-22]; namely $O\left(3.77^{n}\right)$ for $d=2$.


## Decision problem

- Given complete set of exact distances: Embed- $\mathbb{R}^{d} \in \mathrm{P}$.
- Given incomplete set of exact distances [Saxe'79]:

Embed- $\mathbb{R} \in$ NP-hard. Reduction of set-partition.
Embed- $\mathbb{R}^{d} \in$ NP-hard, for $d \geq 2$, even if lengths $\in\{1,2\}$.

- Embed- $\mathbb{R}^{2} \in \mathrm{NP}$-hard for planar graphs with all lengths $=1$ [Cabello,Demaine,Rote'03]
- Given distances $\pm \epsilon$, approximate-Embed- $\mathbb{R}^{d} \in$ NP-hard [Moré,Wu'96]


## Algebraic interlude

## Multihomogeneous Bézout bound

Given a square system of $m$ polynomials let $A_{1}, \ldots, A_{n}$ be a partition of the variables, $m_{j}=\left|A_{j}\right|, m=m_{1}+\cdots+m_{n}$.

The $i$-th polynomial is homogeneous of degree $d_{i j}$ in $A_{j}$.
Let $y_{1}, \ldots, y_{n}$ be symbolic parameters.
Then, the number of isolated roots in $\mathbb{P}^{m_{1}} \times \cdots \times \mathbb{P}^{m_{n}}$ is bounded by the coefficient of $y_{1}^{m_{1}} \cdots y_{n}^{m_{n}}$ in

$$
\prod_{i=1}^{m}\left(d_{i 1} \cdot y_{1}+\cdots+d_{i n} \cdot y_{n}\right)
$$

$a_{1}^{2}-a_{2}+1, a_{1} a_{2}-2:\left(2 y_{1}+y_{2}\right) \cdot\left(y_{1}+y_{2}\right)=2 y_{1}^{2}+3 y_{1} y_{2}+y_{2}^{2}$.

## Multihomogeneous system

Embedding coordinates $X_{v} \in \mathbb{C}^{d}, v \in V$ :
$\sum_{i=1}^{d} X_{v i}^{2}=s_{v}, v \in V_{i} \quad s_{u}+s_{v}-2\left\langle X_{u}, X_{v}\right\rangle=\lambda_{u v}^{2},(u, v) \in E$.
$n$ variable subsets $\left\{X_{v}, s_{v}\right\}$, symbolic parameter $y_{v}$.
Fix $K_{d}$ ( $d$ vertices) thus defining $\left(V^{\prime}, E^{\prime}\right)$.
Then:

$$
\prod_{i=1}^{n-d} 2 y_{i} \cdot \prod_{k=1}^{\left|E^{\prime}\right|}\left(y_{k_{1}}+y_{k_{2}}\right)=2^{n-d} \prod_{i=1}^{n-d} y_{i} \cdot \prod_{k=1}^{\left|E^{\prime}\right|}\left(y_{k_{1}}+y_{k_{2}}\right)
$$

m -Bézout $=$ coefficient of $y_{1}^{d} \cdots y_{n-d}^{d}$ in product of sums $\times 2^{n-d}$.

## Permanent method

Given $m \times m$ matrix $A$, per $(A)=\sum_{\sigma \in S_{m}} \prod_{i=1}^{m} A_{i, \sigma(i)}$.

## Theorem

Let $A$ contain degrees $d_{i j}$. The m-Bézout bound equals

$$
\operatorname{per}(A) /\left(m_{1}!\cdots m_{n}!\right) .
$$

For rigid graphs this becomes $2^{n-d} \cdot \operatorname{per}(A) / d!^{n-d}$.
Using permanent bounds [Brègman-Minc'63,'73], m-Bézout improves Bézout's bound for $d \geq 5$ [Bartzos,E,Schicho]

## Desargues

per $(A)=32$, actual embeddings $c_{2}(G)=24, c_{S^{2}}(G)=32$

|  | $(1,3)$ | $(2,3)$ | $(1,5)$ | $(2,6)$ | $(3,4)$ | $(4,5)$ | $(4,6)$ | $(5,6)$ |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $x_{3}$ | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 |
| $y_{3}$ | 1 | 1 | 0 | 0 | 1 | 0 | 0 | 0 |
| $x_{4}$ | 0 | 0 | 0 | 0 | 1 | 1 | 1 | 0 |
| $y_{4}$ | 0 | 0 | 0 | 0 | 1 | 1 | 1 | 0 |
| $x_{5}$ | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 1 |
| $y_{5}$ | 0 | 0 | 1 | 0 | 0 | 1 | 0 | 1 |
| $x_{6}$ | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 1 |
| $y_{6}$ | 0 | 0 | 0 | 1 | 0 | 0 | 1 | 1 |

Graph orientations

## Orientations and m-Bézout

Observation [Bartzos,E,Schicho'20]
For rigid $G(V, E)$, fixed $K_{d}=\left(v_{1}, \ldots v_{d}\right)$, let $G^{\prime}=\left(V, E \backslash E\left(K_{d}\right)\right)$.
Set $B=$ \#orientations of $G^{\prime}$, constrained so that:

- the outdegree of $v_{1}, \ldots, v_{d}$ is 0 ,
- the outdegree of every $v_{i} \in V \backslash V\left(K_{d}\right)$ is $d$.

Then, $B$ equals the coefficient of $y_{1}^{d} \cdots y_{n-d}^{d}$ in

$$
\prod_{k=1}^{\left|E^{\prime}\right|}\left(y_{k_{1}}+y_{k_{2}}\right)
$$

Corollary. The embedding number of $G$ in $\mathbb{C}^{d}$ is bounded by $2^{n-d} B$

## Desargues


$d=2$, fixed $K_{2}$ is the dashed edge,
$B=2$ orientations $\Rightarrow 2 \cdot 2^{6-2}=32$ bound, actually 24 real/complex embeddings [Hunt'83].

## Pseudographs

A pseudograph $L(U, F, H)$ is a collection s.t.

- $U$ is the set of vertices
- $F$ is a set of (normal) edges $(u, v)$
- H is a set of hanging (half) edges ( $u$ )


The normal subgraph $G^{\prime}(U, F)$ is connected.

Example: Fixed $e^{*}=\left(v_{1}, v_{2}\right) \in E . U=V \backslash\left\{v_{1}, v_{2}\right\}$, $F=\left\{e \in E: v_{1}, v_{2} \notin e^{*}\right\}, H=\left\{e \in E: v_{1}\right.$ xor $\left.v_{2} \in e^{*}\right\}$


## Count constrained orientations

- Elimination step removes $\ell \geq 1$ vertices, and $2 \ell$ adjacent edges, keeping the pseudograph connected.
- Deleted/Hanging edges directed towards removed vertex.
- Cost = \#pseudographs generated per step
- The product of costs bounds $B=\#$ constrained orientations.
- Vertex and Path elimination steps:



## Bound on orientations

## Theorem (Bartzos, E,Vidunas'20)

For pseudographs of $n$ vertices, $k$ hanging edges, $B \leq \alpha_{d}^{n} \cdot \beta_{d}^{k-1}$ :

$$
\alpha_{d}=\max _{p \geq d}\left(2^{p-d}\binom{p}{d}^{2 d-3}\right)^{1 /(2 p-3)}, \beta_{d}=\left(2 /\binom{p}{d}^{2}\right)^{1 /(2 p-3)}
$$

for $p$ maximizing $\alpha_{d}$; note $\beta_{d}<1$.
Corollary For Laman graphs, \#complex embeddings
$\leq\left(4 \cdot(3 / 4)^{1 / 5}\right)^{n-2}=O\left(3.776^{n}\right)$.

## Asymptotic bounds

Complex embedding number $=O\left(b^{n}\right)$, where $b$ is as follows:

| $d=$ | 2 | 3 | 4 | 5 | 6 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| [Bartzos,E,Vidunas'21] | 3.776 | 6.840 | 12.69 | 23.90 | 45.53 |
| [Bartzos,E,Schicho'20] | 4.899 | 8.944 | 16.73 | 31.75 | 60.79 |
| Bézout | 4 | 8 | 16 | 32 | 64 |

Same results for spherical embeddings.

## Extensions

## Distance matrix

Square matrix $M$, with real entries, $M_{i i}=0, M_{i j}=M_{j i} \geq 0$.
$M$ is embeddable in $\mathbb{R}^{d}$ iff $\exists$ points $p_{i} \in \mathbb{R}^{d}: M_{i j}=\frac{1}{2} \operatorname{dist}\left(p_{i}, p_{j}\right)^{2}$.
Theorem (Cayley'41,Menger'28)
$M$ embeds in $\mathbb{R}^{d}$ for min d, iff Cayley-Menger (border) matrix has

$$
\operatorname{rank}\left[\begin{array}{cc}
0 & 1 \\
1 & M
\end{array}\right]=d+2
$$

and, for any $(k+1) \times(k+1)$ border minor $D$ :

$$
(-1)^{k} D \geq 0, \quad k=2, \ldots, d+1 .
$$

The latter are strict inequalities iff $d$ is minimum.

## Approximate input

## Model noisy distances by intervals.

Improve upper/lower bounds by triangular/tetrangular inequalities. Use graph algorithms (e.g. All-min-paths) [Havel]

## Structure-preserving matrix perturbations.

Theorem. [Wicks,Decarlo'95] Given matrix and specific entries allowed to change, we can compute a continuous, locally differentiable function minimizing $\sigma_{n}$.

Method applied for $\sigma_{n}, \sigma_{n-1}, \ldots, \sigma_{n-5}$ [Nikitopoulos,E'02]

## Incomplete data

Embedding is equivalent to completing an incomplete matrix so as to get a PSD Gram (or distance) matrix: expressed as feasibility of a PSD program.

Complexity:

- Solving PSD programs with arbitrary precision $\in P_{\mathbb{R}}$ (interior-point or ellipsoid algorithms).
- Recall: interior-point, ellipsoid algorithms for LP are in $\mathrm{P}_{\text {bit }}$.
- Open whether LP in $\mathrm{P}_{\mathbb{R}}$ (strong polytime).


## Chordal Graphs

- A graph is chordal if it contains NO empty cycle of length $\geq 4$.
- Thm [Grone,Sa,Johnson,Wolkowitz' 84] [Bakonyi,Johnson'95] Every partial distance matrix with graph $G$ has valid completion iff $G$ is chordal. $[\Leftarrow]$ poly-time algorithm [Laurent'98]
- Thm [Laurent] If \#edges needed to make $G$ chordal is $O(1)$, then distance-matrix completion $\in \mathrm{P}_{\text {bit }}$.
- Generally, minimizing \#edges to make G chordal is NP-hard.


## Contributions / Further questions

- First nontrivial upper bounds on embedding number.
- Closed formula of upper bound on graph orientations.
- m-Bézout bound better than by permanent
- Tensegrity: edge weight correspond to intervals
- Specific counts, Global rigidity (unique embedding)
- Polynomial-time cases of permanent

Thank you!

SoCG


11-14 June
Athens,Greece

See you in Athens for SoCG / CG-Week 2024

