

# The Euclidean Distance Matrix Completion Problem

CJ, W&M

## Overview

- (Euclidean) Distance Matrices,  
theory
- Matrix Completion Problems
- Important Graph Theory
- The Distance Matrix Case

## References

a motivation : molecular conformation

# Euclidean Distance Matrices

$$P_1, P_2, \dots, P_n \in \mathbb{R}^k$$

$$\|x\| = (x^T x)^{\frac{1}{2}}, \quad x \in \mathbb{R}^k$$

$$d(P_i, P_j) = \|P_i - P_j\|$$

Note

$$D = (d(P_i - P_j)^2) \in M_n(\mathbb{R})$$

symmetric, nonnegative  
0-diagonal ("hollow")

Necessary

$D$  is a "distance matrix" iff  
such  $P_1, P_2, \dots, P_n$  exist  
embedding dimension -  
smallest  $k$

- Blumenthal
- Schönberg

# Recognizing EDM's

If  $D \in M_n(\mathbb{R})$  meets the obvious necessary conditions,

TFAE

i)  $D$  is an EDM

ii)  $D$  is negative (semi-)definite on the orthogonal complement of  $e =$  the vector of 1's.

iii) the Schur complement of

$$\begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix} \text{ in}$$

$$\begin{bmatrix} 0 & e^T \\ e & D \end{bmatrix}$$

is negative definite

In fact, the rank of this Schur complement is the embedding dimension  $k$  for the points - if  $D$  is an EDM.

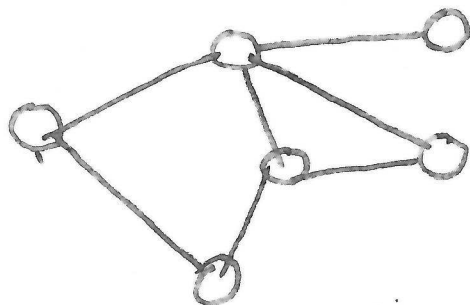
## Other Approaches

Linear transformations that map the EDM's to/from the PD matrices; these transfer the question to checking for PD and produce a set of points, when they exist.

# The Important Graph Theory

(Undirected) Graphs:

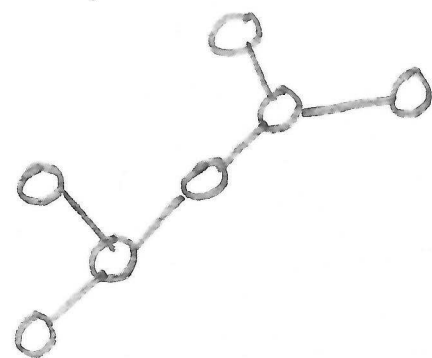
Vertices,  
Edges



6V

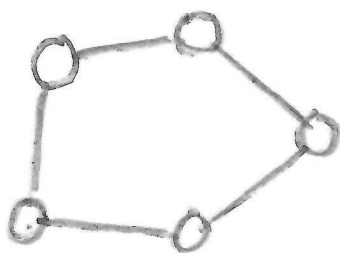
7E

Path

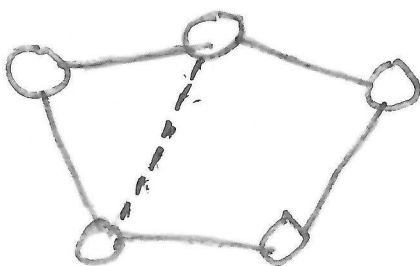


Tree

Cycle

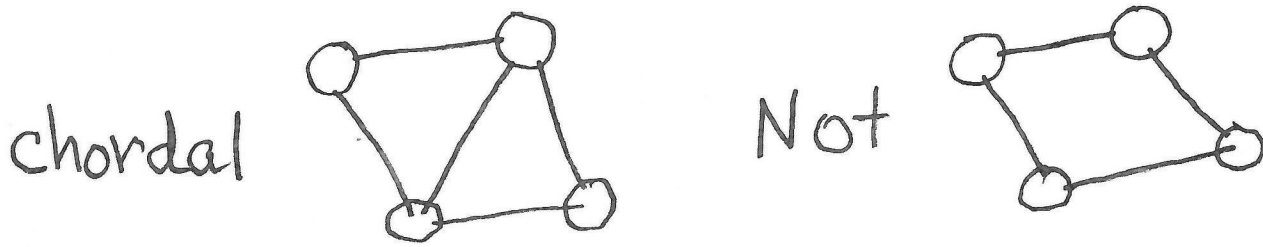


chord  
of  
a  
cycle



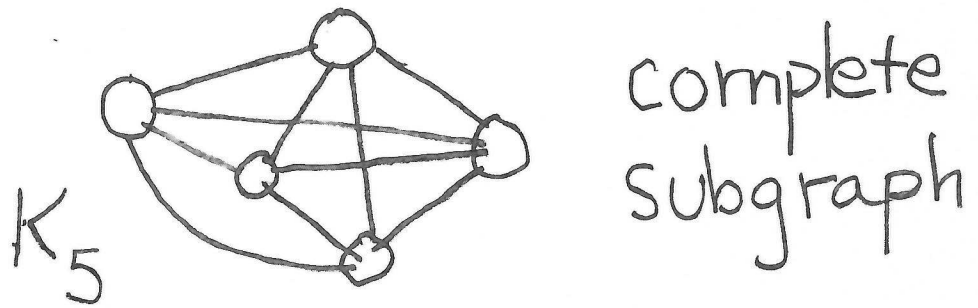
# Chordal Graphs connected undirected

- every cycle of length 4 or more has a chord

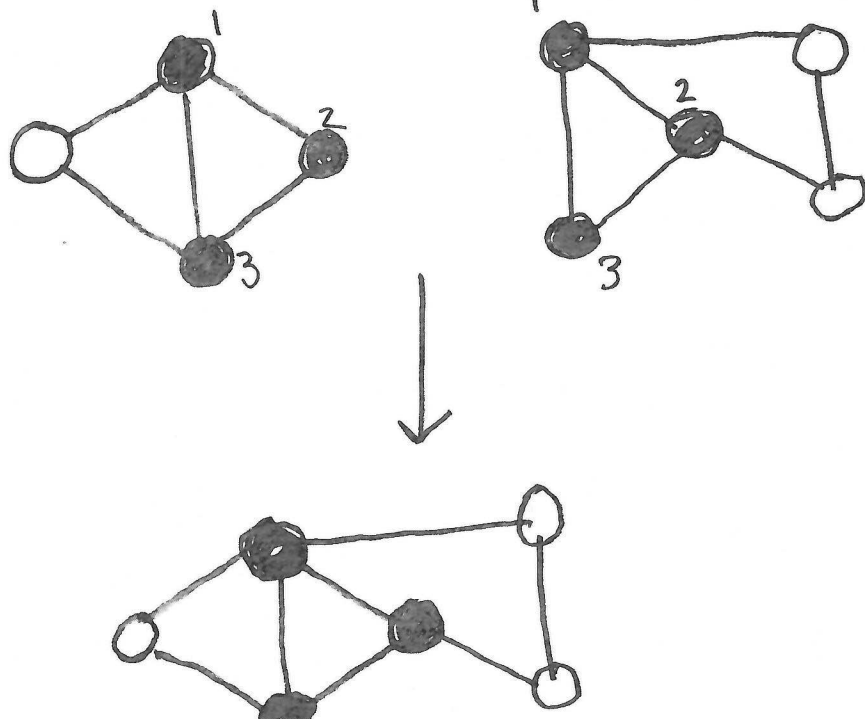


trees are all chordal

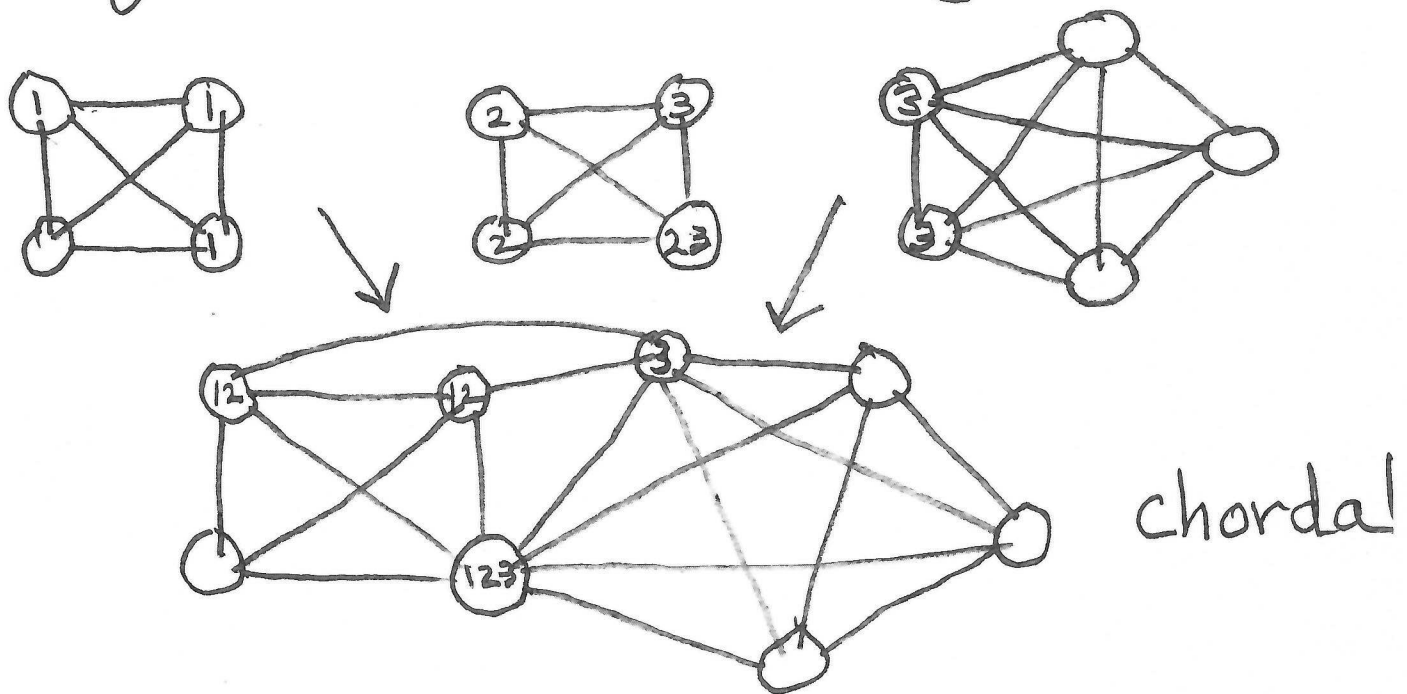
clique



clique-sum of 2 graphs



Theorem. A graph is chordal iff it is a sequential clique-sum of cliques



Corollary. A graph is chordal iff edges may be added, one at a time, so that the resulting sequence of graphs are all chordal (non-unique)

# Matrix Completion Problems

Property  $\mathcal{P}$  that a matrix  
may or may not have  
e.g. positive definite (PD)  
rank  $k$   
Euclidean distance  
stable etc.

For square matrices,  $\mathcal{P}$  is  
said to be inherited if  
every principal submatrix  
of a matrix with  $\mathcal{P}$   
also has  $\mathcal{P}$

e.g. PD, totally positive,  
Euclidean distance



# Real Polynomially Describable

We say that property  $\mathcal{P}$  is RPD if it may be viewed as a semi-algebraic set in  $\mathbb{R}^n$  (or  $\mathbb{C}^n$ ), i.e. describable via a finite list of polynomial equalities and inequalities.

Assertion: All properties that anyone cares about are RPD (J, L-D).

in particular, Euclidean distance matrices

"Partial matrix": Some entries specified, while the others are free to be chosen

$$\begin{bmatrix} 3 & -1 & ? & 4 \\ -1 & 5 & 2 & ? \\ ? & 2 & 2 & 0 \\ 4 & ? & 0 & 7 \end{bmatrix}$$

? = free  
(unspecified)

"Completion": choice of values for the unspecified entries, resulting in a conventional matrix.

eg

$$\begin{bmatrix} 3 & -1 & \textcircled{-1} & 4 \\ -1 & 5 & 2 & \textcircled{1} \\ \textcircled{-1} & 2 & 2 & 0 \\ 4 & \textcircled{1} & 0 & 7 \end{bmatrix}$$

$\mathcal{P}$ -completion problem:

Which partial matrices have a completion with property  $\mathcal{P}$ ?

If  $\mathcal{P}$  is inherited, it is necessary that the partial matrix be "partial  $\mathcal{P}$ ", i.e. all fully specified principal submatrices have property  $\mathcal{P}$ .

This necessary condition may or may not be sufficient. It depends on the "pattern" (of specified entries).

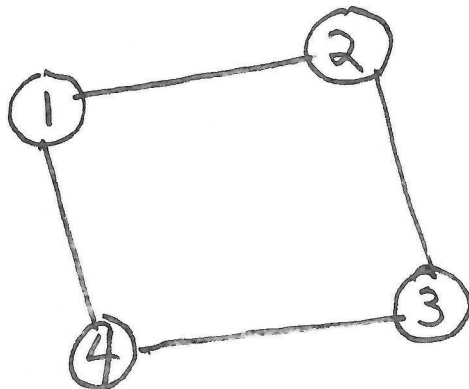
Patterns e.g. 
$$\begin{bmatrix} \bullet & x & ? & x \\ x & \bullet & x & ? \\ ? & x & \bullet & x \\ x & ? & x & \bullet \end{bmatrix}$$

In the case of combinatorially symmetric patterns, the pattern of the specified entries may be described with a(n) (undirected) graph

$i, j$  entry specified  $\leftrightarrow$

$i \text{ --- } j$  is an edge

e.g.



$$\begin{bmatrix} \bullet & x & ? & x \\ x & \bullet & x & ? \\ ? & x & \bullet & x \\ x & ? & x & \bullet \end{bmatrix}$$

Important fact:

IF  $\mathcal{P}$  is RPD, then, for any fixed pattern, for the specified entries of a partial matrix, the  $\mathcal{P}$ -completable partial matrices form a semi-algebraic set! So,  $\mathcal{P}$ -compleatability may be checked via finitely many polynomial inequalities.

(These may not be easy to find and there may be a lot of them.)

For some patterns, and certain inherited properties  $\mathcal{P}$ , these conditions are no more than being partial  $\mathcal{P}$  !

These  $\mathcal{P}$ -completable patterns are important to understand

Note. There is a similar discussion for properties involving non-combinatorially-symmetric matrices, or even non-square matrices.  
E.g. totally positive (TP) matrices

# Classical Result (GJSW 1984)

Every partial positive definite matrix, the graph of whose specified entries is  $G$ , has a positive definite completion iff  $G$  is chordal!

much more to say here

# The EDM Completion Problem:

Which partial matrices have an EDM completion?

EDM: an inherited property

So, to have an EDM completion, every fully specified principal submatrix of a partial matrix must itself be an EDM, i.e.

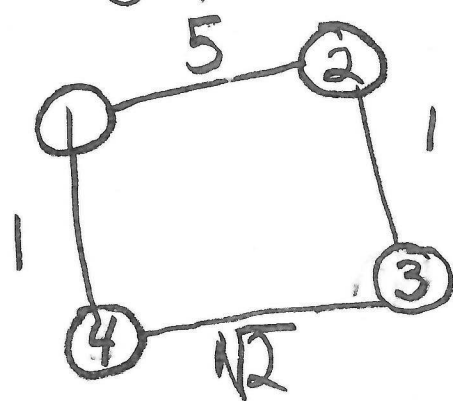
a "partial EDM"

This is not always sufficient.



Example. For any cycle of 4 or more edges, positive weights on the edges give a partial EDM

e.g.



$$\begin{bmatrix} 0 & 25 & ? & 1 \\ 25 & 0 & 1 & ? \\ ? & 1 & 0 & 2 \\ 1 & ? & 2 & 0 \end{bmatrix}$$

each specified submatrix is 2-by-2, e.g.

$$\begin{bmatrix} 0 & 2 \\ 2 & 0 \end{bmatrix}$$

But, there can be no EDM completion.

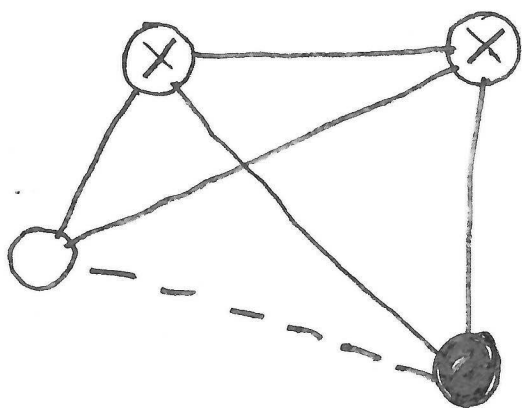
5 is too big!

Similarly, for no graph with a long ( $\geq 4$  edges) chordless cycle, can partial EDM be sufficient for an EDM completion.

"Bad" data for the cycle may always be embedded in partial EDM data for the entire graph.

So, what are the graphs for which partial EDM is sufficient for EDM completion?

Chordality is necessary.  
It is also sufficient!



For any realization of the  $\otimes, \bullet$  triangle and the  $\otimes, \circ$  triangle the Euclidean length of the dashed edge is determined.  
(May also see this analytically)

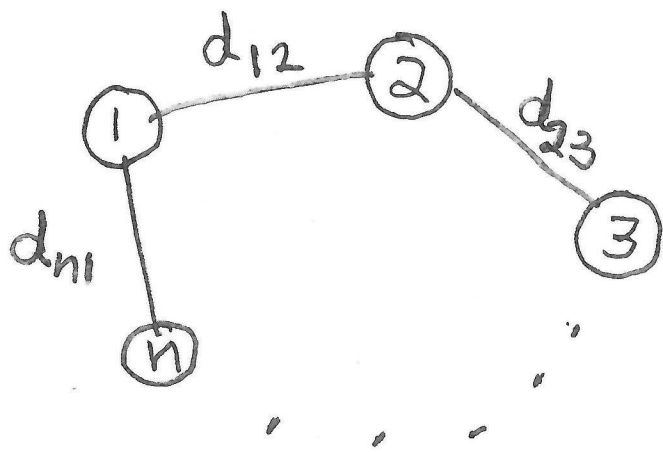
Since we may complete a chordal graph to a complete one by adding edges and maintaining chordality, the overlapping clique case is sufficient.

Theorem. Given a graph  $G$ , every partial EDM with graph  $G$  has an EDM completion iff  $G$  is chordal.

What about other graphs?

More conditions are necessary.

The case of (simple) cycles



Cycle inequality suffices.

"maximum edge distance  
 $\leq$  sum of the other  
distances"

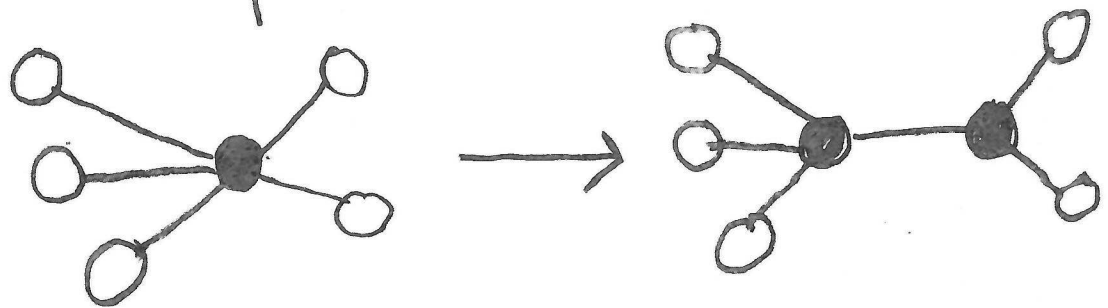
This condition is necessary  
on the induced cycles of  
any non-chordal graph.  
When is it sufficient?

EDM is RPD (semi-algebraic).  
So, for any graph, the  
EDM completable partial  
matrices may be identified  
by finitely many polynomial  
conditions.

(Hard to know what they are  
for a given graph.)

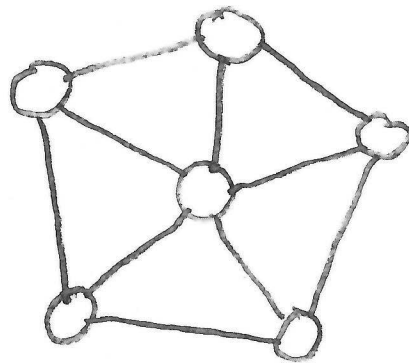
For which graphs are they  
the cycle conditions  
(+ partial EDM)?

# Vertex partition



Graph  $G_2$  is "built from"  $G_1$  if  $G_2$  may be obtained from a finite number (at least 1) of vertex partitions.

$W_k$ : wheel on  $k$  vertices



$W_6$

Theorem. Every partial matrix, the graph of whose specified entries is  $G$ , and whose induced cycles satisfy the cycle inequalities has an EDM completion iff

$G$  has no induced subgraph that is  $W_k$ ,  $k \geq 5$ , nor that can be built from  $W_k$ ,  $k \geq 4$ .

Notes: • other equivalent graph theoretical conditions

• can be checked in linear (?) time

Other graphs?



## Selected References

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