Eigenspaces of Graphs and their Utility

Garrett J. Kepler
Joint Mathematics Meeting
January 10th, 2025

1. Preliminaries
2. Characterization
3. Classification
4. Application
5. Future Work

Background

Background

Definition

The *Laplacian* matrix $L = [\ell_{ij}] \in M_n$ is defined such that

$$\ell_{ij} = \begin{cases} d_i & \text{if } i = j \\ -1 & \text{if } i \text{ adjacent to } j \\ 0 & \text{otherwise} \end{cases}$$

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Let $0 = \lambda_1 \leq \lambda_2 \leq \cdots \leq \lambda_n$ be the eigenvalues of L. We call the second smallest eigenvalue of L, λ_2, and its corresponding eigenvector the *Fiedler value* and *Fiedler vector* respectively.

Combinatorial View of Fiedler Value

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Theorem

Since the constant vector $\mathbb{1}$ is an eigenvector of L corresponding to 0, by Rayleigh-Ritz, the Fiedler value of L corresponds to the following minimum:

$$\lambda_2 = \min_{x \perp \mathbb{1}} \frac{x^T L x}{x^T x} = \min_{x \perp \mathbb{1}} \frac{\sum_{i \sim j} (x(i) - x(j))^2}{\sum_i x(i)^2}$$

Fiedler Partitioning Theorem

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Let $G = (V, E)$ be a connected graph and let x be its corresponding Fiedler vector. Then the subgraphs induced by the vertex sets $V_1 = \{i : x_i > 0\}$ and $V_2 = V \setminus V_1$ are connected.

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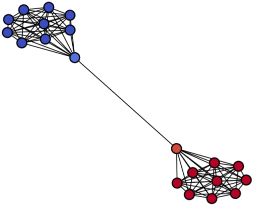
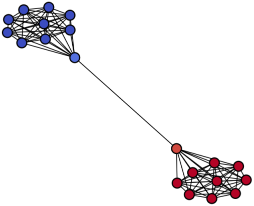
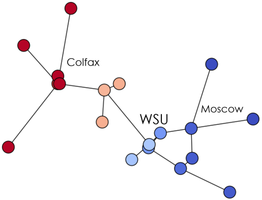
Informally: we can partition G in to two connected components using the entries of the Fiedler vector.



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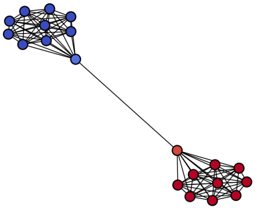

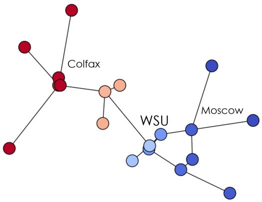
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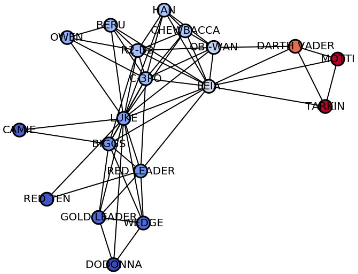
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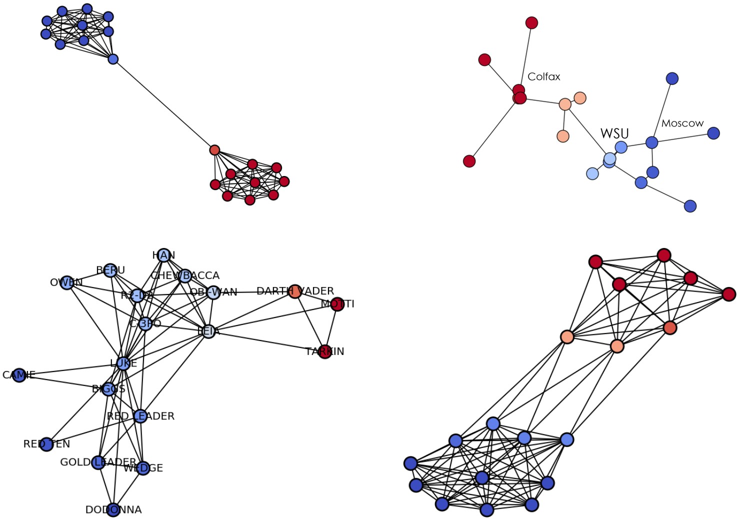
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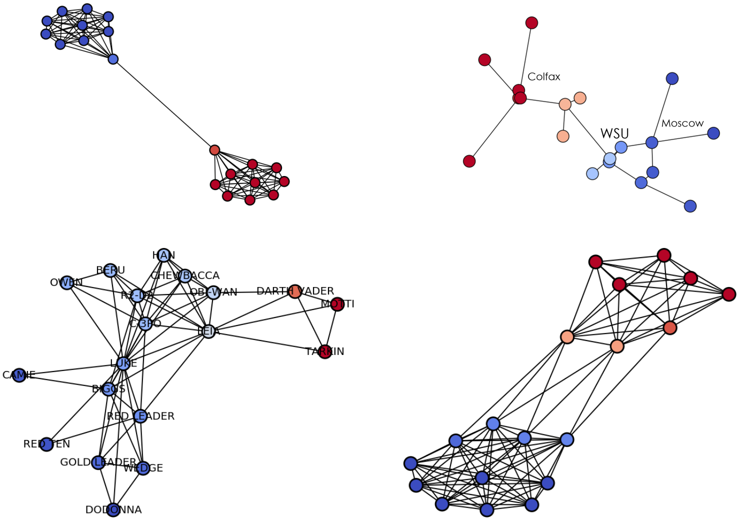
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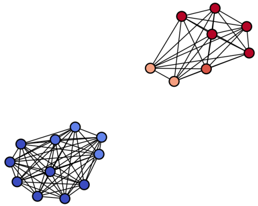

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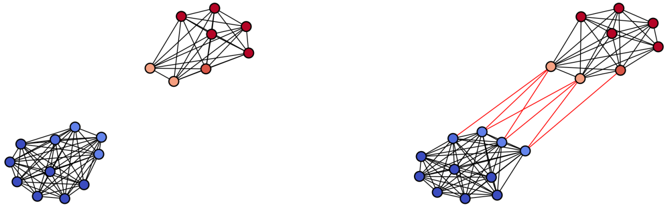

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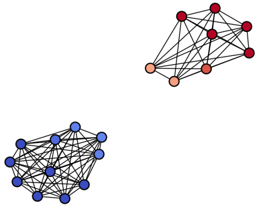

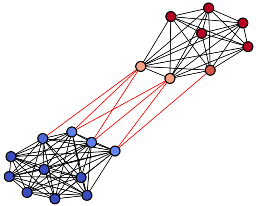

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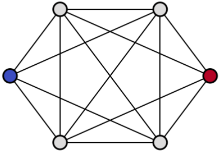

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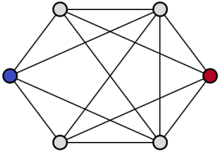
$$\lambda = 4$$



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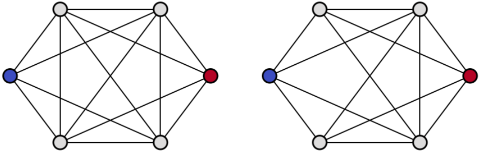

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Let x be an eigenvector of L corresponding to λ. If $x(i) = x(j)$ for some entries of x, the inclusion or removal of edge (i, j) maintains x as an eigenvector and λ as its corresponding eigenvalue.

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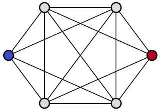

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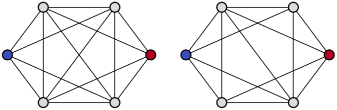

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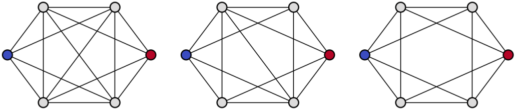

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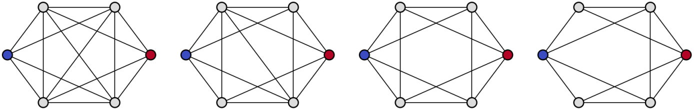

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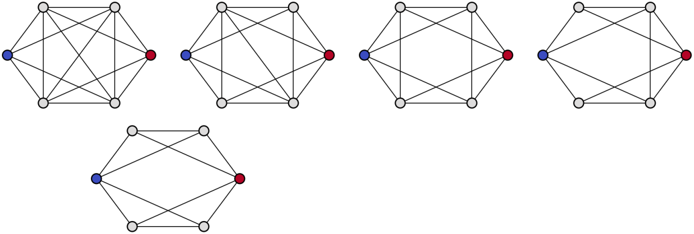

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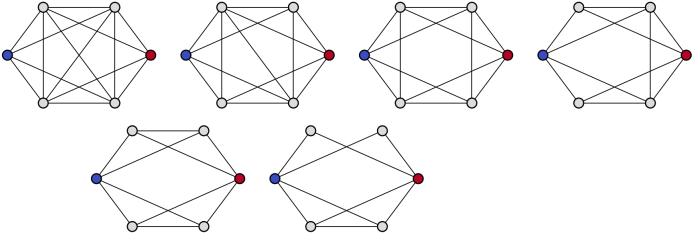

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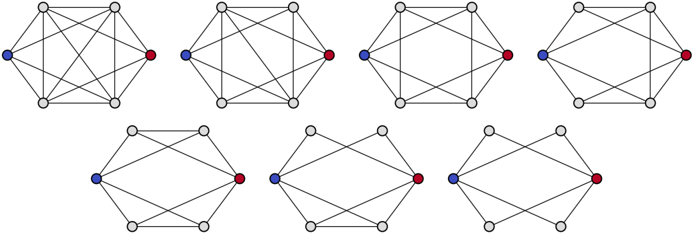

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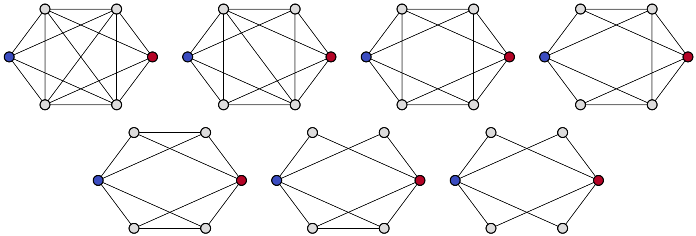

Main Classification Question

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Given a graph, can we determine how much information about the missing edges can be revealed by its Fiedler vector?

Method

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An Approach: Construct vector around class of graphs

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- Pick a class of graphs

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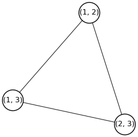

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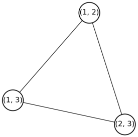

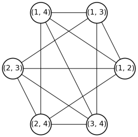

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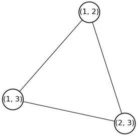

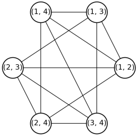

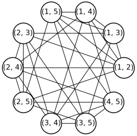

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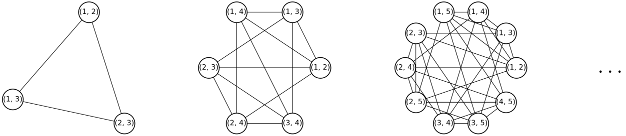
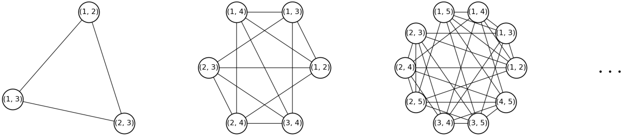


$\underline{J(2,n)}$:

An Example



$\underline{J(2, n)}$:

- Constant vector ($\lambda = 0$)

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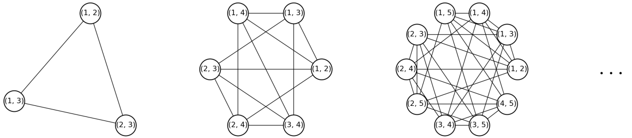

$J(2, n)$:

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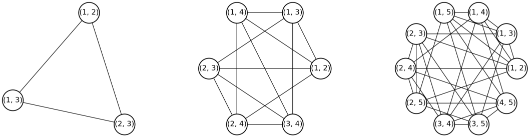

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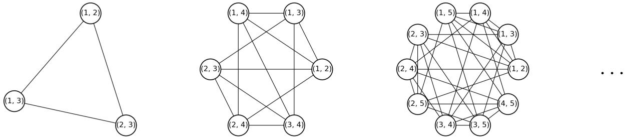

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(**Bonus**: eigenvector construction above generalizes to $J(k, n)$ by merely keeping track of intersections!)

Already Characterized Classes

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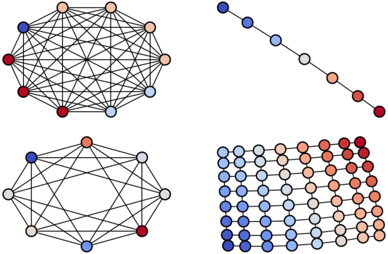
- Complete graphs ✓
- Path graphs ✓
- Grid graphs ✓
- Circulant graphs ✓

⋮



Dimension Reduction

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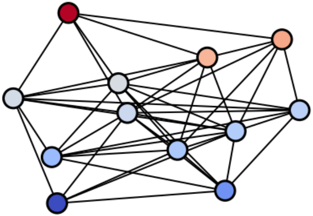
- In the case that we are able to reconstruct some number of missing edges, we are able to reduce the amount of required data from a graph to determine bottlenecking information



$$\longmapsto \begin{bmatrix} 0.642\ldots \\ -0.091\ldots \\ -0.070\ldots \\ 0.312\ldots \\ -0.178\ldots \\ -0.005\ldots \\ 0.040\ldots \\ 0.023\ldots \\ 0.267\ldots \\ -0.312\ldots \\ -0.508\ldots \\ -0.119\ldots \end{bmatrix}$$

MCMC Methods

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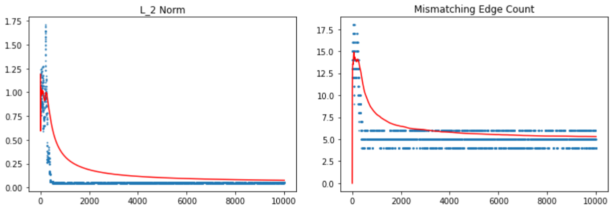
- Some recent work has been done investigating MCMC approximation of graphs via the Fiedler vector
- Classifying the reconstructibility of graphs via the Fiedler vector can aid in the reliability of these methods



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- In finding graphs with maximally informative Fiedler vectors, we cleverly picked vectors we knew would be an eigenvector for some graph. What are the constraints for entries that guarantee finding such a graph is possible?

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- Extending to k-eigenvector partitioning, what subset of eigenvectors do we need to maximize/minimize the information we can reconstruct via their entries?

Other Interesting Work

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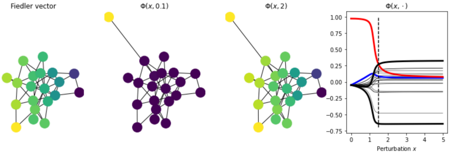

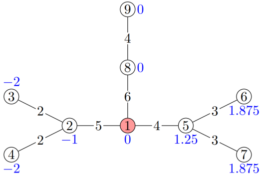

- "Perturbation of Fiedler vector: interest for graph measures and shape analysis" by Lefevre, Fraize, & Germanaud
  url: https://arxiv.org/abs/2306.04327

- "Inverse Fiedler vector problem of a graph" by Lin & Shirazi
  url: https://arxiv.org/abs/2410.09736

Thank you!

garrett.kepler@wsu.edu