Marija Mitrović

Introduction and motivationconnecting structure and dynamics

Model of multiscale (community) networks

Spectral properties

Conclusion

Modularity of networks from the perspective of spectral analysis

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BIONET08

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Outline

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- Introduction and motivationconnecting structure and dynamics
- Model of multiscale (community) networks
- Spectral properties
- Conclusion

Introduction and motivation-connecting structure and dynamics

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Model of multiscale (community) networks



3 Spectral properties



Multiscale structure of networks

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- Modular structure common properties of biological, social and IT networks.
- Connection between dynamics and stucture of network.

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Network of networks

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Model parameters α , P_o and M.

B.Tadić, Physica A 293,(2001). M. Mitrović and B. Tadić, LNCS, (2008)

Multiscale networks

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Adjacency matrix



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Closer look at cliques on random tree

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 Clique of size N has one eigenvalue equal
) ... = N = 1 and

$$\lambda_N = N = 1$$
 and $\lambda_1 = \ldots = \lambda_{N-1} = -1$

• Spectra of random tree with cliques contains information about number of cliques.

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Spectral density of adjacency matrix

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Eigenvalues around $\lambda = 3$ and $\lambda = 5$ are related to existence of cliques of size N = 4 and N = 6.

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Randomized networks

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Same degree distribution and average connectivity.

Power law degree distribution and same average connectivity.

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Eigenvectors

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Eigenvector for eigenvalue $\lambda = 5.04$ is localized on cliques.

Eigenvalue $\lambda = 0$ is related to chain with odd number of nodes.

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Looking at the dynamics-random walk

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Ranking of eigenvalues for networks with different *M*

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Eigenvectors for Laplacian

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Eigenvectors for Laplacian

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- The largest eigenvalue in spectra is equal 2 only for tree networks $(M = 1, \alpha = 1).$
- Eigenvalues $\lambda = 1$ are related with chains.

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Eigenvector for largest eigenvalue $\lambda = 2$ for tree of trees network.

Conlusion

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- We presented a model of multiscale networks and investigate spectral properties of adjacency matrix and normalized Laplacian.
- Spectral properties depend on global structure and structure of modules in networks.
- Eginevector of adjacency matrix and Laplacian operator contain information about the structure of networks.

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