

# Theoretical frameworks for the SIRS model in complex networks with different localization patterns

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In the present work, we investigate the performance of theoretical approaches in the prediction of properties of the SIRS epidemic model, which involves immunity periods  $1/\alpha$  and whose acronym indicates the allowed states (*susceptible, infected and recovered*) as well as the transitions among them.

As a special case, we have the SIS model ( $1/\alpha = 0$ ), whose activation mechanisms in power-law degree distributed networks,  $P(k) \sim k^{-\gamma}$ , are well known. They involve self-sustained activity by means of feedback mechanisms in subextensive subgraphs [1], thus spreading to the rest of the network, with the epidemic threshold vanishing in the thermodynamic limit [2, 3]. The *quenched mean-field theory* [4] predicts this behavior qualitatively, with the threshold  $\lambda_c = \frac{1}{\Lambda_A}$  vanishing in the thermodynamic limit, where  $\Lambda_A$  is the Largest Eigenvalue (LEV) of the adjacency matrix  $A_{ij}$ . An enhancement of the QMF theory is the *pair-quenched mean-field theory* (PQMF), which takes into account the dynamic correlations at a pairwise level [5].

In the SIR limit ( $1/\alpha = \infty$ ), there is a transition to a state in which the fraction of recovered agents is finite, with a vanishing epidemic threshold in power-law distributed networks with  $\gamma \leq 3$  and a finite one when  $\gamma > 3$ . This behavior is well captured by the *heterogeneous mean-field theory* and the exact threshold is predicted by the *message passing* approach [6] on top of tree-like networks.

It is not clear which theoretical approach would be more suitable for the SIRS model with finite immunity periods  $1/\alpha$ , what is the main concern of our present work [7]. To investigate their properties, we developed PQMF equations for the SIRS model on networks and the rDMP equations reported in [8], whose predictions for threshold and Inverse Participation Ratio (IPR) [9, 10] were compared with extensive stochastic simulations. For more details, we refer the reader to [7].

Our results show that PQMF theory outperforms other approaches in networks without considerable localization effects [7]. Fig. 1 shows how localization affects mean-field theory predictions, by introducing a *hub* in a *random regular* network. PQMF theory undergoes strong localization on the hub and its neighborhood, while rDMP theory shows less localized behavior, agreeing qualitatively with simulation results, specially in dynamics with longer immunity times  $1/\alpha$ . Other results shown

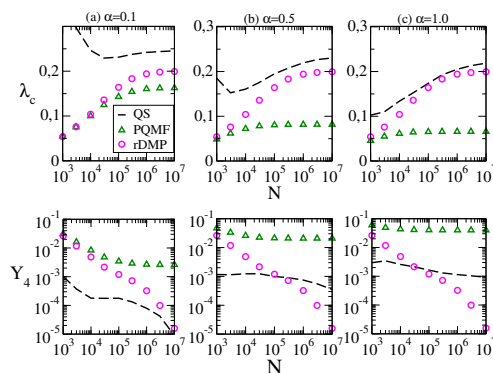


FIG. 1. Finite size scaling for SIRS model in random regular networks ( $k_{RR} = 6$ ) with hub ( $k_{hub} = 10^3$ ). Upper row: threshold  $\lambda_c$ . Lower row: IPR at the threshold. Immunity rates  $\alpha$  indicated at the column heading.

in our paper [7] present the same tendency of localization for the PQMF theory in the asymptotic limit, predicting a vanishing epidemic threshold, while simulations and rDMP theory predict delocalization and a finite threshold in power-law degree distributed networks with  $\gamma > 3$  [7].

**Keywords:** Epidemiology - Mathematical models. Networks (Mathematics). SIRS model. Immunity period. Mean-field theory.

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- [1] C. Castellano and R. Pastor-Satorras, Competing activation mechanisms in epidemics on networks, *Scientific Reports* **2**, 371 (2012).
  - [2] M. Boguñá, C. Castellano, and R. Pastor-Satorras, Nature of the epidemic threshold for the susceptible-infected-susceptible dynamics in networks, *Phys. Rev. Lett.* **111**, 068701 (2013).
  - [3] S. C. Ferreira, R. S. Sander, and R. Pastor-Satorras, Collective versus hub activation of epidemic phases on networks, *Phys. Rev. E* **93**, 032314 (2016).
  - [4] F. Chung, L. Lu, and V. Vu, Spectra of random graphs with given expected degrees, *PNAS* (2003).
  - [5] A. S. Mata and S. C. Ferreira, Pair quenched mean-field theory for the susceptible-infected-susceptible model on complex networks, *Europhysics Letters* **103**, 48003 (2013).
  - [6] B. Karrer and M. E. Newman, Message passing approach for general epidemic models, *Physical Review E* (2010).
  - [7] J. C. M. Silva, D. H. Silva, F. A. Rodrigues, and S. C. Ferreira, Comparison of theoretical approaches for epidemic processes with waning immunity in complex networks, *Phys. Rev. E* **106**, 034317 (2022).
  - [8] M. Shrestha, S. V. Scarpino, and C. Moore, Message-passing approach for recurrent-state epidemic models on networks, *Physical Review E* **92**, 022821 (2015).
  - [9] A. V. Goltsev, S. N. Dorogovtsev, J. G. Oliveira, and J. F. F. Mendes, Localization and spreading of diseases in complex networks, *Phys. Rev. Lett.* **109**, 128702 (2012).
  - [10] D. H. Silva and S. C. Ferreira, Dissecting localization phenomena of dynamical processes on networks, *Journal of Physics: Complexity* **2**, 025011 (2021).