

## Synchronized SIS process and a possibly largest non-Markovian threshold

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The (Markovian) SIS process on

networks

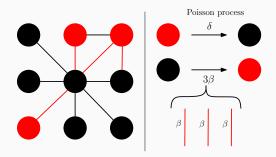
#### The Markovian SIS model on networks

The Susceptible-Infected-Susceptible (SIS) process on networks:

Each node is either **Infected** or **Susceptible** (healthy);

The infection and curing process are **Poisson processes** (the time length between two adjacent infections is **exponentially distributed**)

Mean-field thresholds — HMF:  $\frac{< D>}{< D^2>}$  NIMFA:  $\frac{1}{\lambda_1}$ 

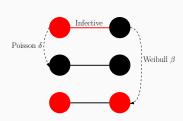


R. Pastor-Satorras and A. Vespignani, Phys. Rev. Lett. 86, 3200 (2001)

P. Van Mieghem, J. Omic and R. Kooij, IEEE/ACM Trans. on Networking, vol. 17, no. 1, Feb. 2009.

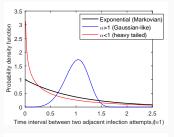
### The Weibullian SIS process

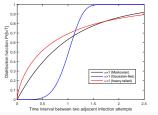
#### SIS model with a Weibull renewal process



The Poisson infection process is a special case.

The infected nodes can be cured with rate  $\delta$  (Poisson).

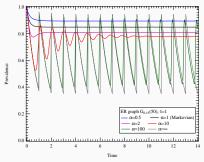




The Weibull infection process can represent very different infections: from long-tailed to Gaussian-like.

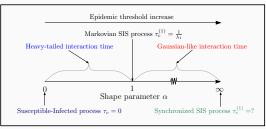
A. Vazquez, B. Racz, A. Lukacs, and A.-L. Barabasi, Phys. Rev. Lett., 98, 158702, (2007) P. Van Mieghem and R. van de Bovenkamp, Phys. Rev. Lett., 110, 108701, (2013)

#### Time-dependent prevalence

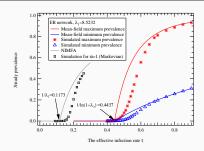


The epidemic threshold varies with  $\alpha$  (No longer  $1/\lambda_1$ ).

What is the range of the epidemic threshold for any infection process?



#### $\alpha \to \infty$ under mean-field approximation



0.8 SF network, λ<sub>1</sub>=119944

Mean-field maximum prevalence

Mean-field maximum prevalence

Mean-field maximum prevalence

Δ Simulation for α=1 (Markovian)

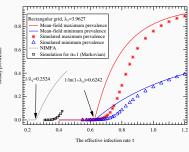
0.6 I λ<sub>1</sub>=0.0834

1/λ<sub>1</sub>=0.0834

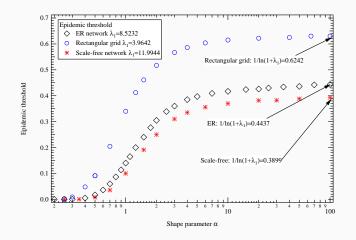
Mean-field approximation:  $E[X_i(t)X_j(t)] = E[X_i(t)]E[X_j(t)].$ 

The same assumption made as in N-IMFA for Markovian process leads to the epidemic threshold,

$$\frac{1}{\ln(1+\lambda_1)}$$



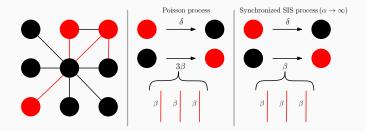
#### Epidemic threshold for $\alpha \in [0, \infty]$



The epidemic threshold changes approximately from 0 to  $\frac{1}{\ln(1+\lambda_1)}$ .

# Further discussions about the limiting case $\alpha \to \infty$ : the synchronized SIS process

#### Comparing with Markovian SIS process



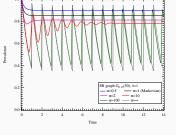
The synchronized infection  $(\alpha \to \infty)$  seems to be the hardest situation for the infection persist on the network among all possible infection processes.

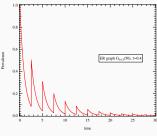
Multiple infected neighbors is equivalent to one.

#### Properties when $\alpha \to \infty$

When  $\tau > \frac{1}{\ln(\lambda_1 + 1)}$ ,  $\frac{\text{Maximum prevalence}}{\text{Minimum prevalence}} < 1 + \lambda_1$ .

When  $\tau<\frac{1}{\ln(\lambda_1+1)}$ , the prevalence is upper bounded by an exponentially decreasing function of time  $\left(\mathrm{e}^{-\delta}(\lambda_1+1)^{\beta}\right)^t c$ .





#### An example: the spreading of computer virus

Improving the virus





Burst on the network



Each development iteration takes  $1/\beta$  time units

Curing with rate  $\delta$ 

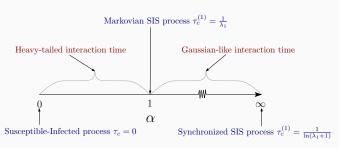
The development cycle of the virus and the topology of the network collectively determines whether the infection can persist or not.

#### Conclusion

We show that non-Markovian infection process can lead to a non-constant infection probability in the steady state.

We provide a possible largest epidemic threshold for the SIS process on a network for any infection process  $\frac{1}{\ln(\lambda_1+1)}$ .

We discussed the properties of the synchronized SIS process (the limiting case  $\alpha \to \infty$ ).



Qiang Liu and P. Van Mieghem, Phys. Rev. E 97, 022309, (2018) Email: Q.L.Liu@TuDelft.nl