

INGENIO PhD Days, Valencia | 7 April 2014

# DIFFUSION OF IDEAS: A PERCOLATION MODEL

*Elena M. Tur*

*With P Zeppini and K Frenken*



INGENIO [CSIC-UPV] Ciudad  
Politécnica de la  
Innovación | Edif 8E 4º  
Camino de Vera s/n  
46022 Valencia

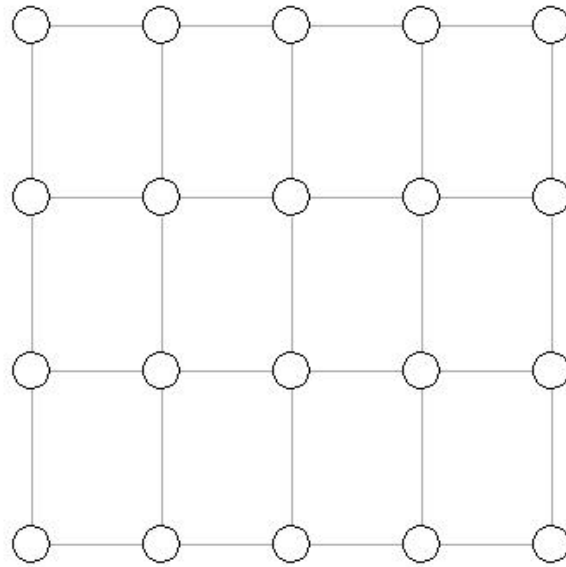
tel +34 963 877 048  
fax +34 963 877 991

# What is percolation?

---

- Diffusion process in a network
  - Spread of rumors (Zanette, 2002)
  - Online spreading of behavior (Centola, 2010)
  - Opinion dynamics (Shao et al., 2009)
  - Paradigm shift in science (Brock and Durlauf, 1999)

# Percolation in a social network



# Percolation in a social network

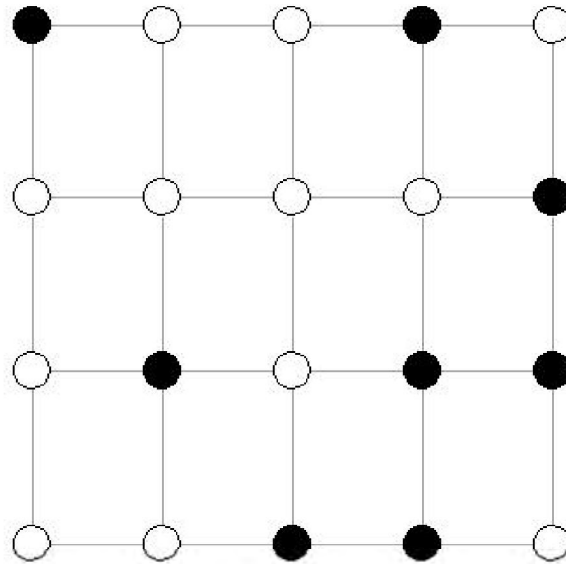
- $v_0 \in [0,1]$ : value of the idea
- $q^i$ : minimum quality requirement of agent  $i$

Agent  $i$  adopts the idea at time  $t$  if:

- $i$  has not adopted before  $t$
- $i$  is informed: a neighbor has adopted at time  $t - 1$
- $i$  is willing to adopt:  $q^i \leq v_0$

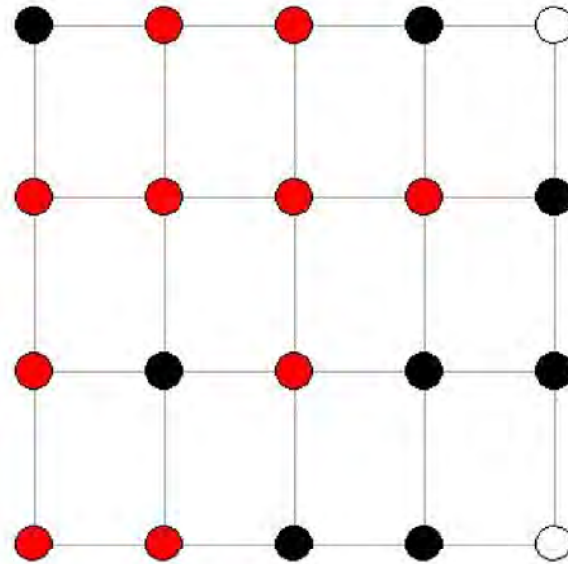
# Percolation in a social network

$$q^i \sim U[0,1] \rightarrow q^i \leq v_0 ?$$



- Willing to adopt
- Unwilling to adopt

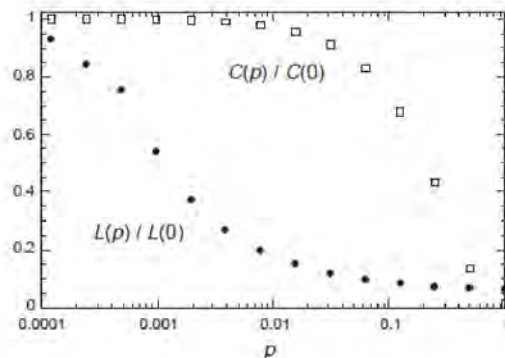
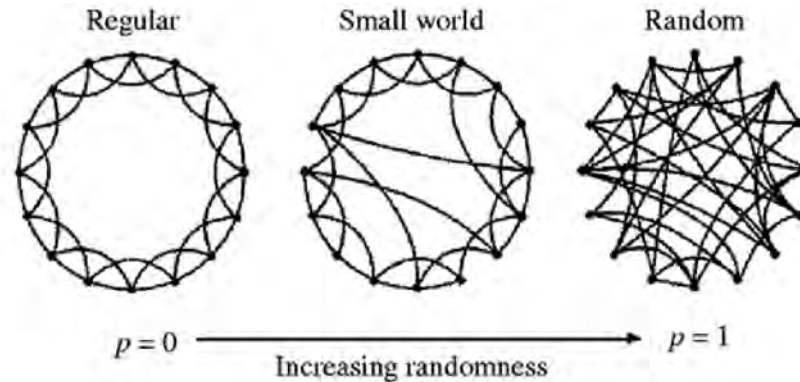
# Percolation in a social network



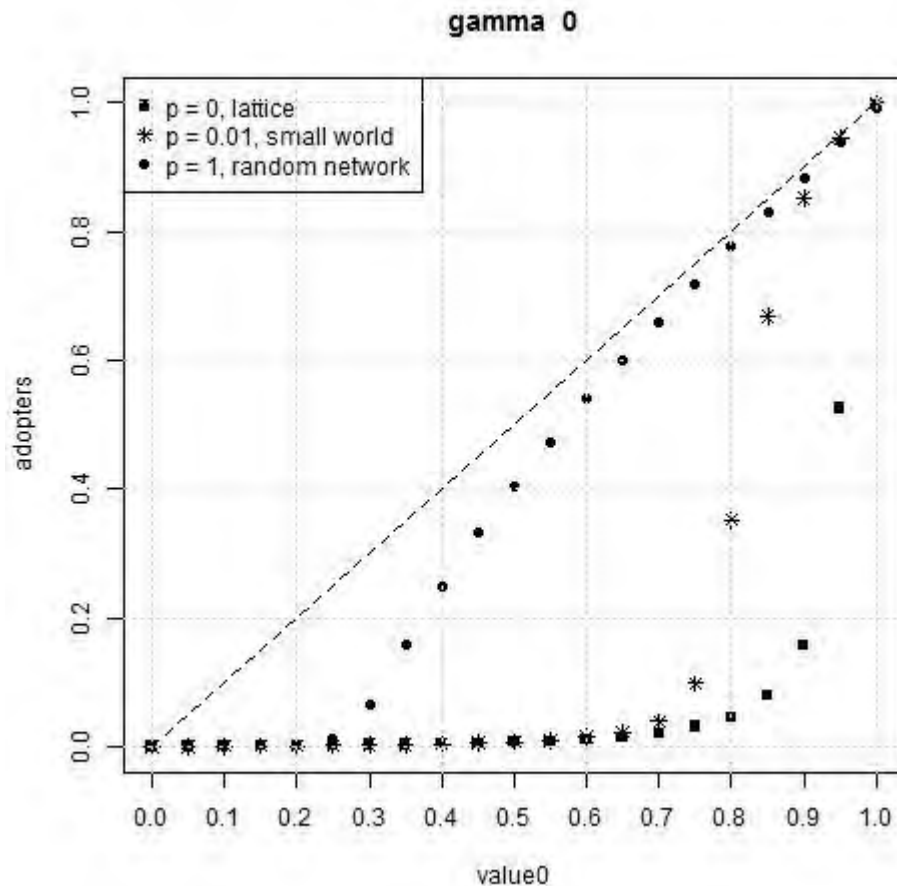
- Willing to adopt
- Unwilling to adopt
- Adopter

# Social network

- Small world (Watts and Strogatz, 1998)  
Starting with a regular lattice, with  $n$  nodes and  $k$  edges per node, rewire each edge at random with probability  $p$
- High clustering coefficient, low average path length



# Percolation without social pressure



- Upper bound to diffusion: 45° line (well-mixed population)
- Diffusion increases with  $p$
- Phase changes: from a non-diffusion to a diffusion regime
- Percolation thresholds decrease with  $p$



# SOCIAL PRESSURE

# Why social pressure?

---

- The unwilling to adopt can be persuaded
- Network externalities: shared language, shared experiences, shared beliefs...
- Increasing amount of evidence
- Conformity (Asch, 1958)
- Weariness

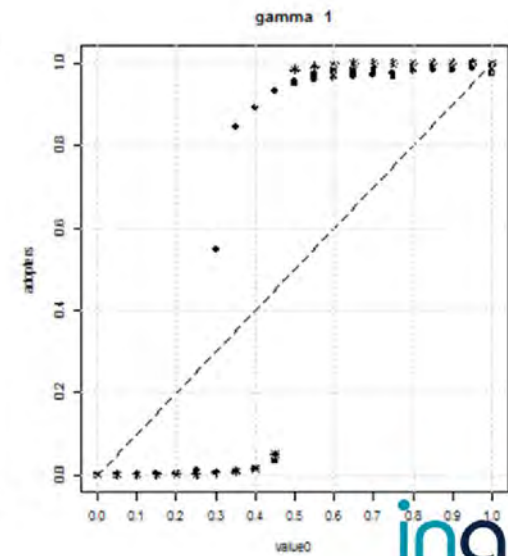
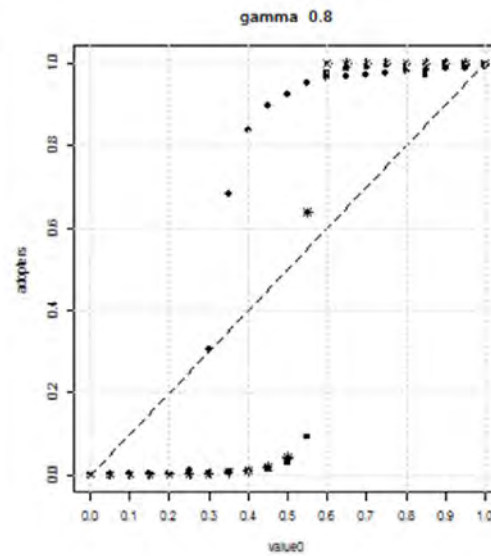
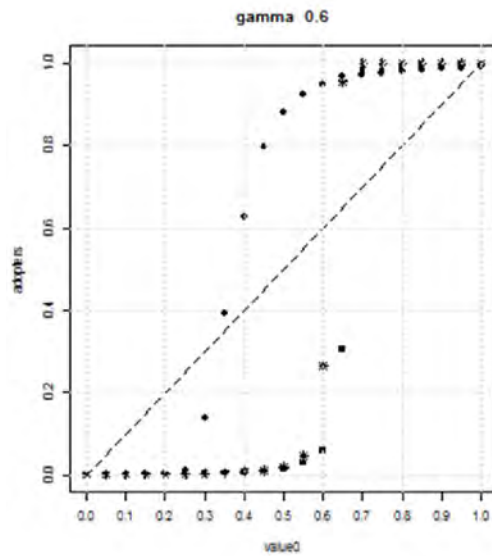
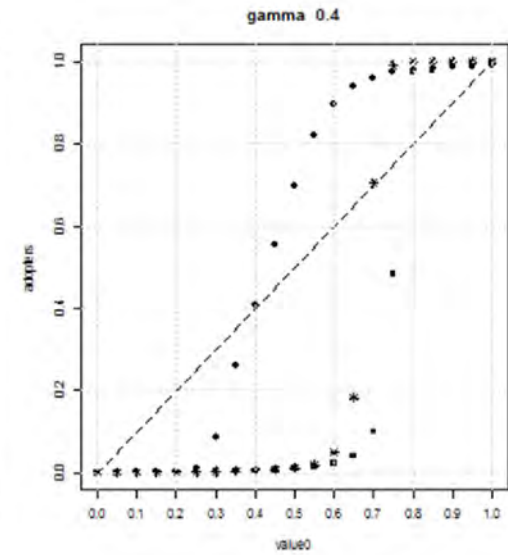
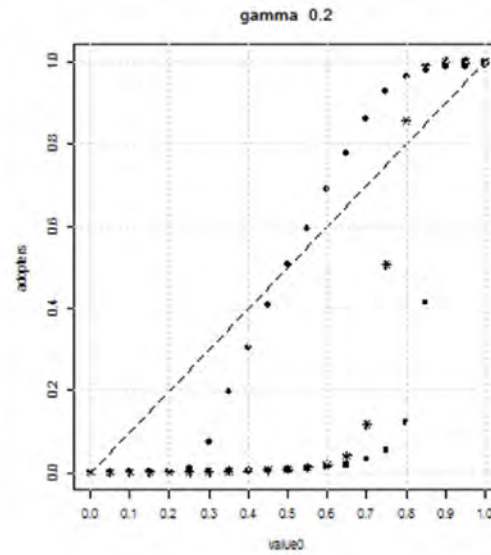
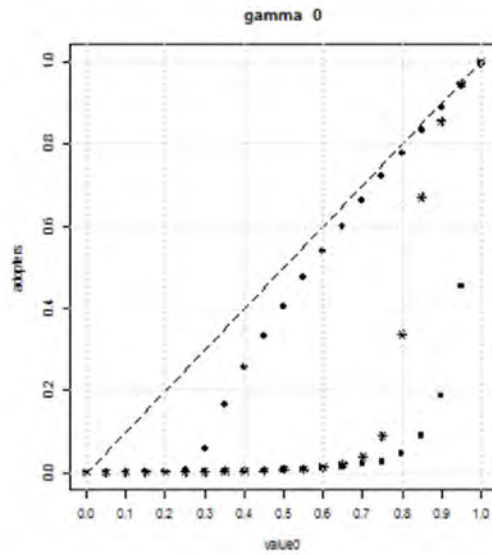
# Modelling social Pressure

- $a_t^i$ : # neighbors of agent  $i$  that have adopted at time  $t$
- $\gamma$ : social pressure intensity

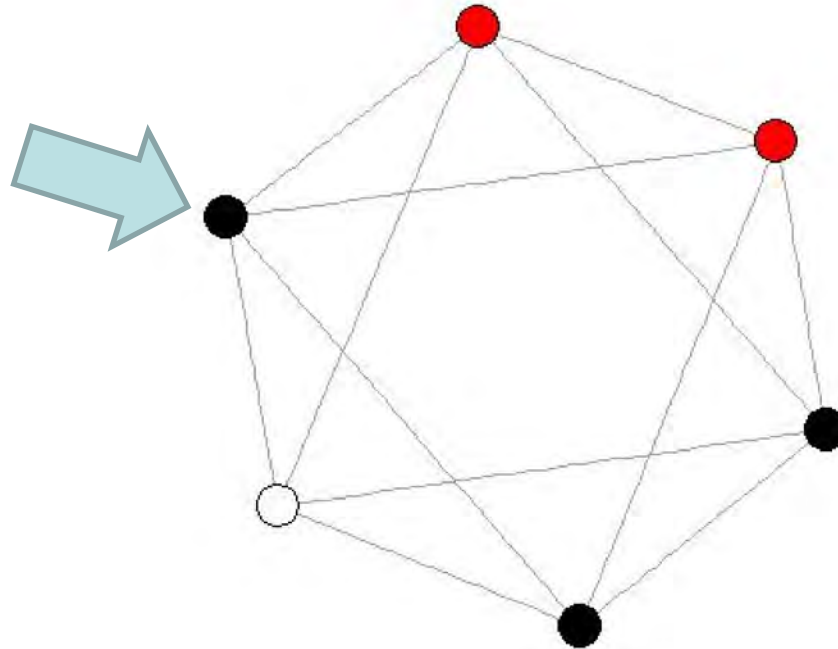
$$q_t^i = q_0^i \cdot \left(\frac{1}{a_t^i}\right)^\gamma$$

- $q_t^i$  is decreasing in the number of adopting neighbors
- $q_t^i$  is decreasing in the social pressure intensity
- $q_t^i = q_0^i$  if  $\gamma = 0$
- $q_t^i = q_0^i$  if  $a_t^i = 1$

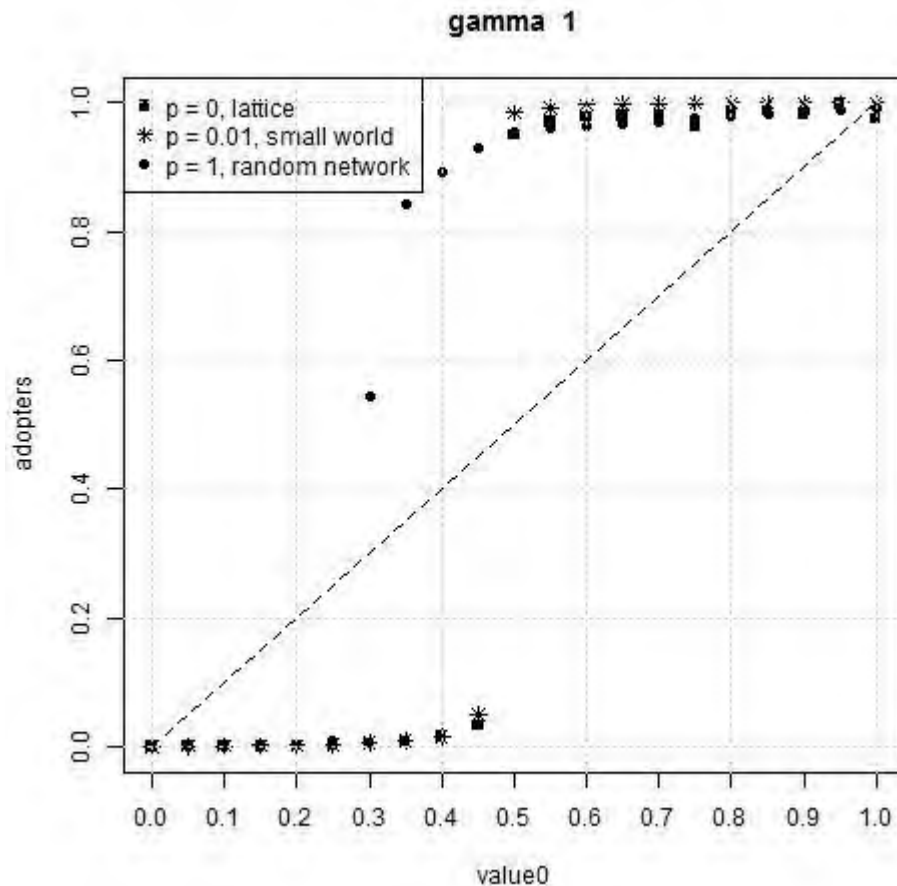
# Percolation with social pressure



# Clustering with social pressure



# Percolation with social pressure

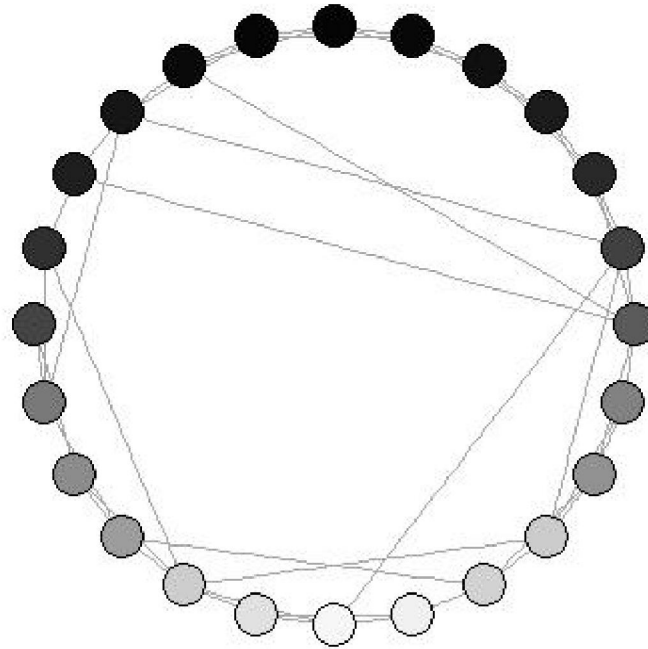


- The 45° line is no longer an upper bound to diffusion
- Diffusion increases
- Percolation thresholds decrease
- Differences between networks are reduced

# ASSORTATIVITY

People tend to be friends with similar people

# Modelling assortativity



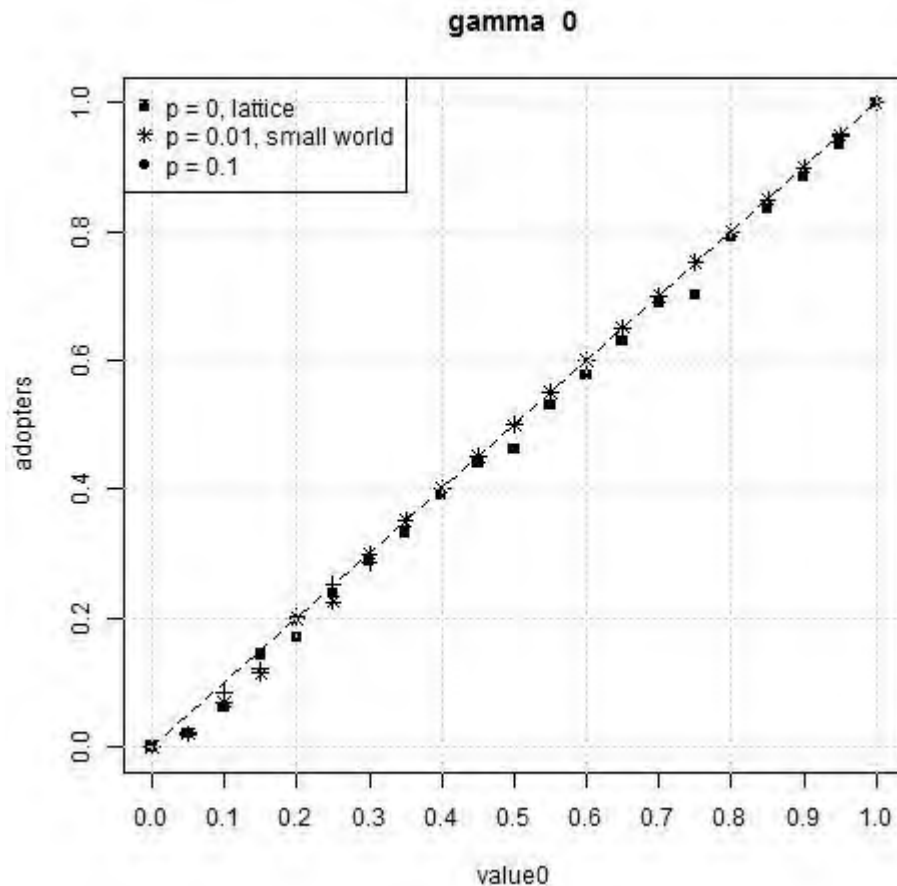
Most willing  
to adopt



Most unwilling  
to adopt

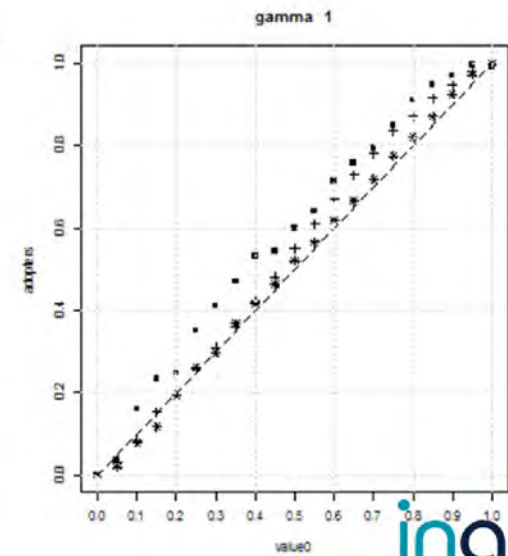
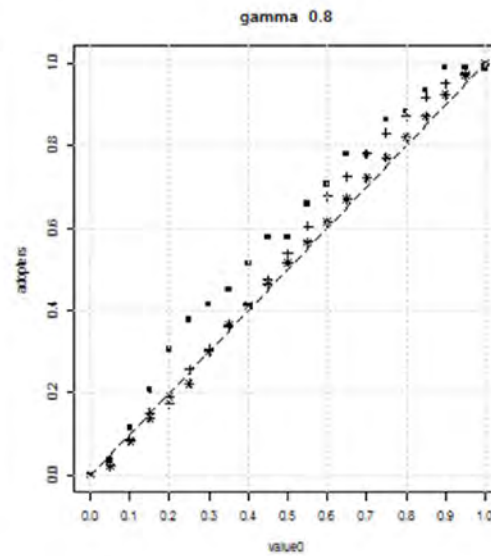
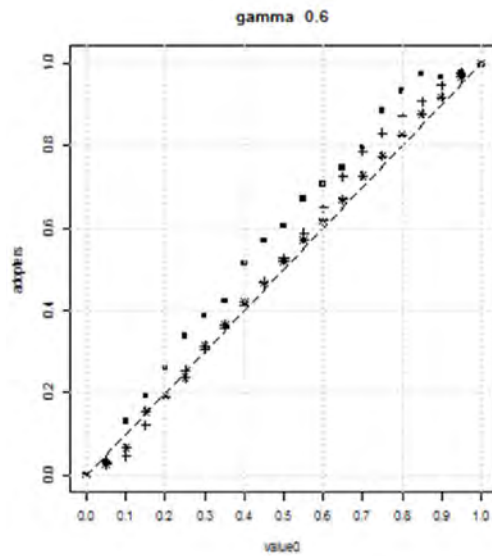
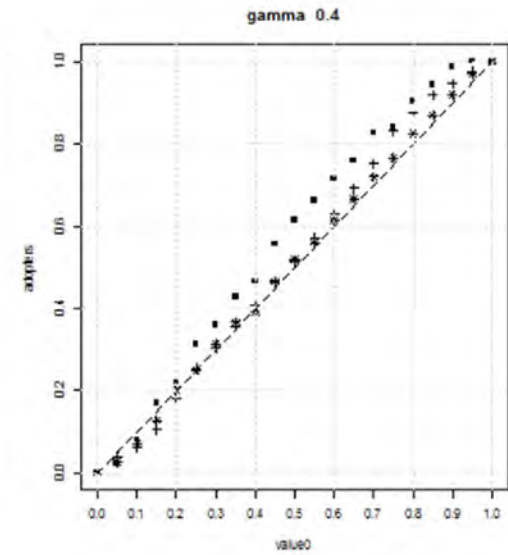
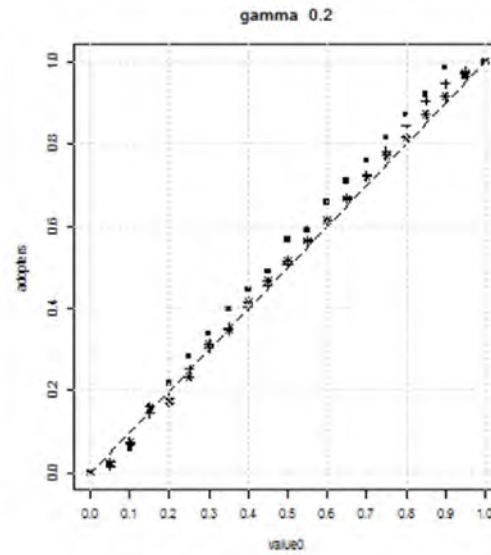
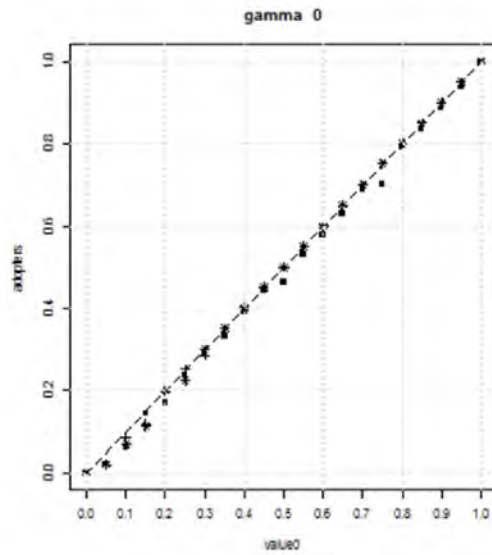


# Percolation with assortativity

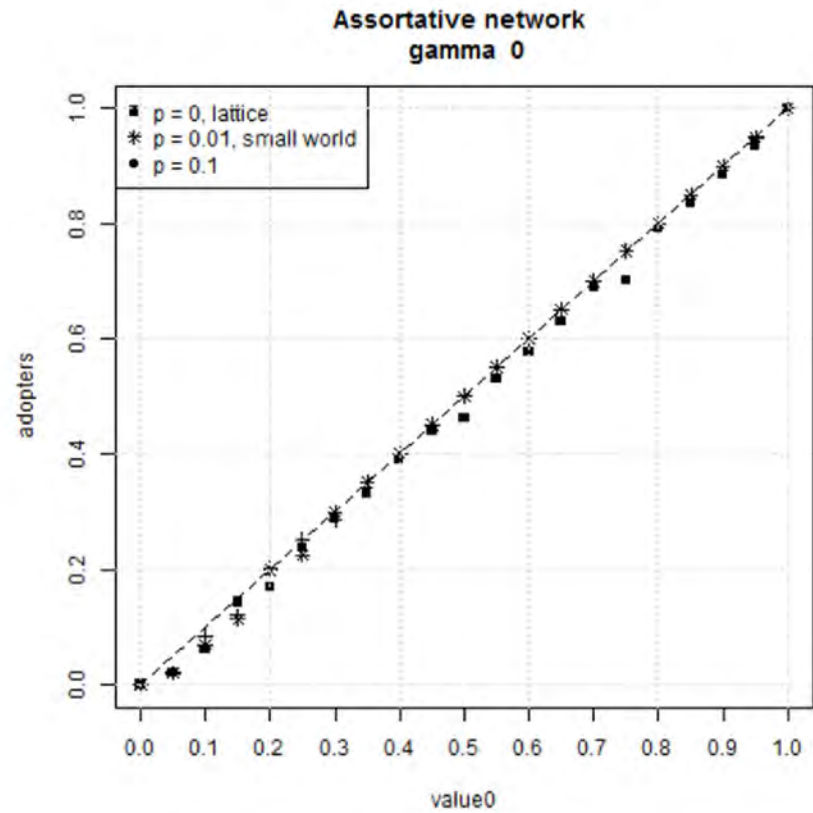
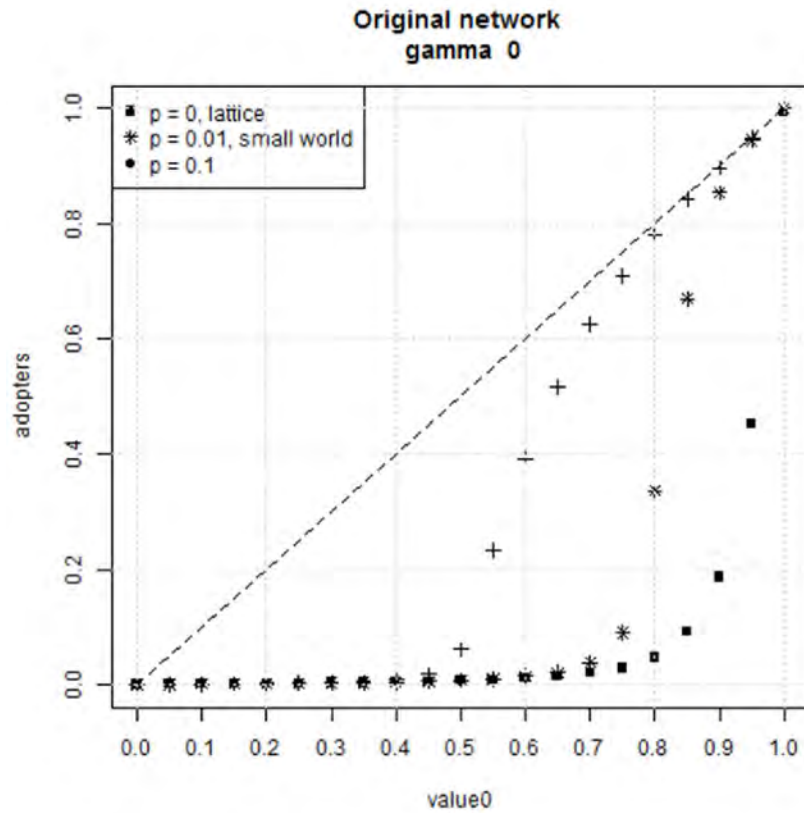


- No critical transition from non-diffusion to diffusion
- Diffusion size scales linearly with idea value
- No effect of the network structure (well-mixed population)

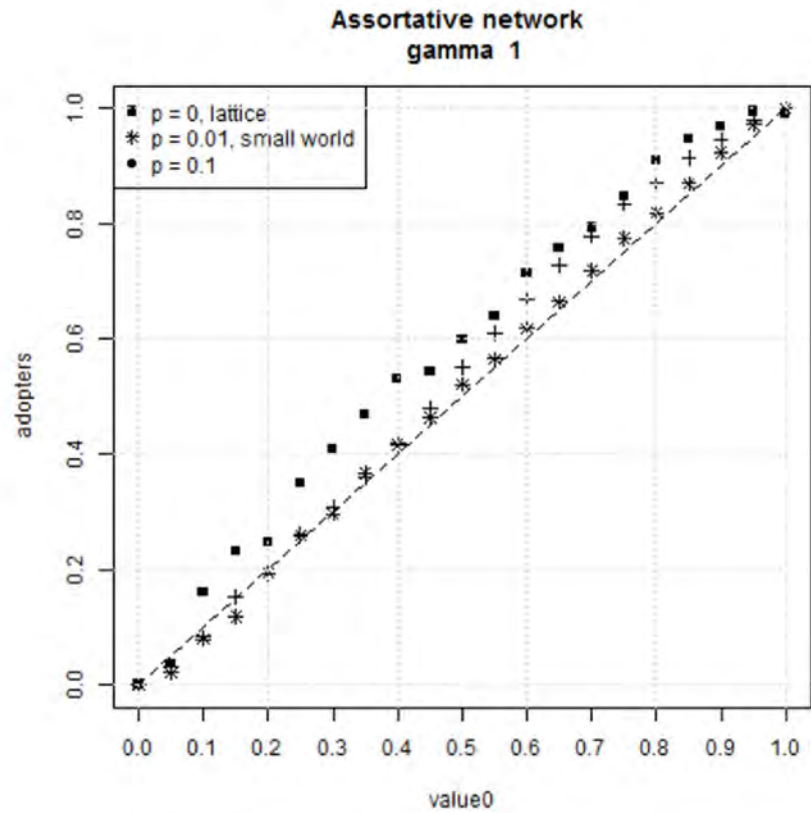
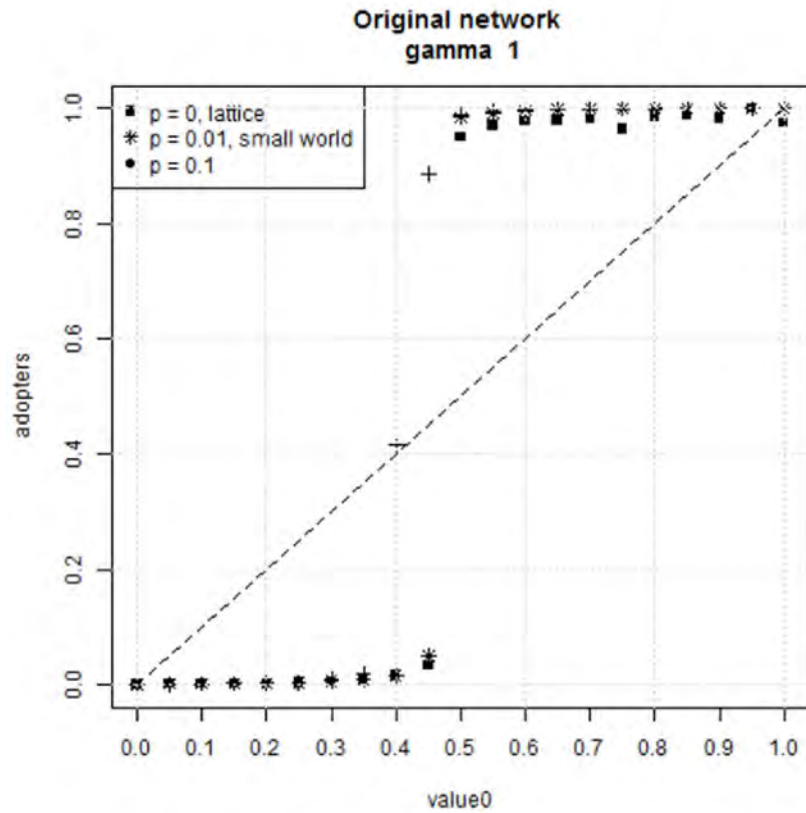
# Percolation with social pressure and assortativity



# Does assortativity help diffusion?



# Does assortativity help diffusion? (2)



# CONCLUSIONS

# Conclusions

---

- Social pressure changes the behavior of the percolation process: higher diffusion size, lower percolation thresholds
- The effect of social pressure is different for different network structures: critical transition in small worlds and lattices
- With social pressure, clustering becomes beneficial for diffusion: reduced differences between networks
- Assortativity removes the effect of the network structure: all behave as a well-mixed population
- Assortativity can help or hamper diffusion depending on the setting

# Future work and limitations

---

- Other social network structures: scale-free networks (Barábasi and Albert, 1999)
- Evolving endogenous social network
- Re-think the social pressure implementation
- Different minimum quality requirement distributions,  $Beta(\alpha, \beta)$



INGENIO [CSIC-UPV] Ciudad  
Politécnica de la  
Innovación | Edif 8E 4º  
Camino de Vera s/n  
46022 Valencia

tel +34 963 877 048  
fax +34 963 877 991