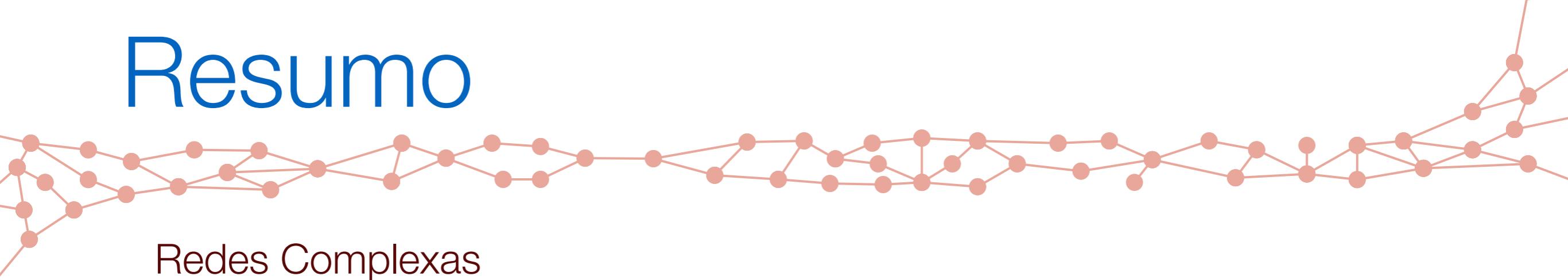


# Ciência das redes e suas aplicações

Filipi Nascimento Silva

Indiana University  
Network Science Institute  
(IUNI)

# Resumo



Redes Complexas

Grafos

Exemplos

Propriedades

Visualização de redes

Aplicações

Caracterização de cidades

Modelo de crises em redes

Análise de textos

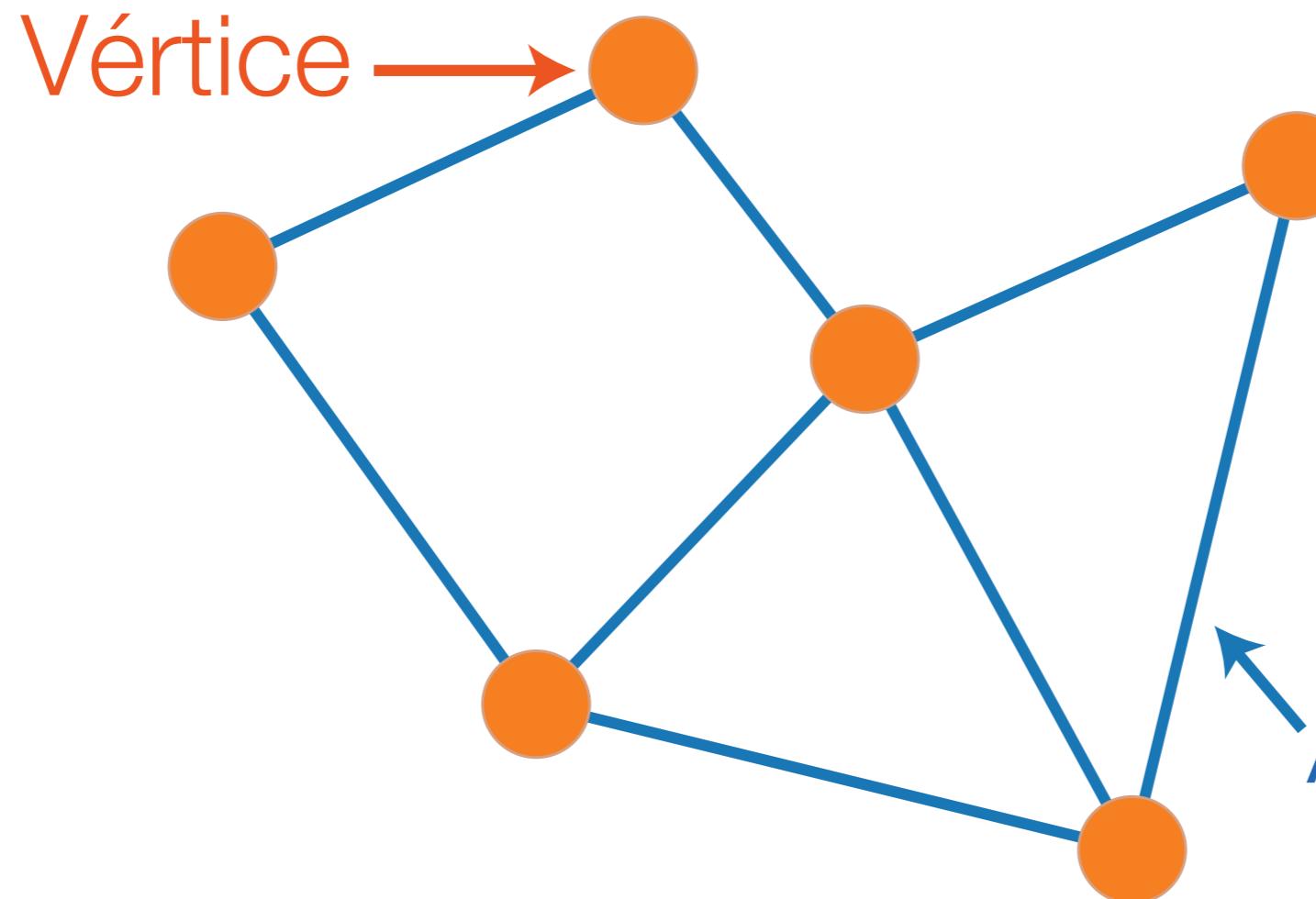
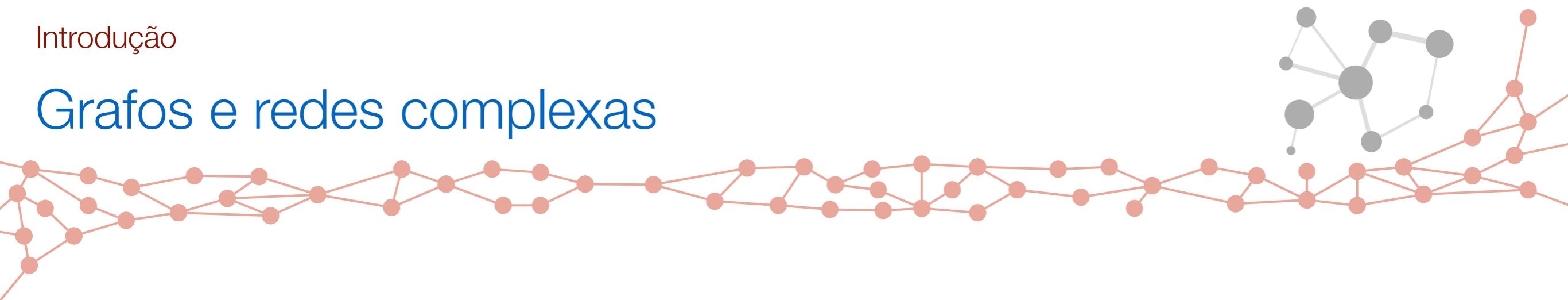
Ciência da ciência

Redes Sociais

Modelos de epidemia

Links

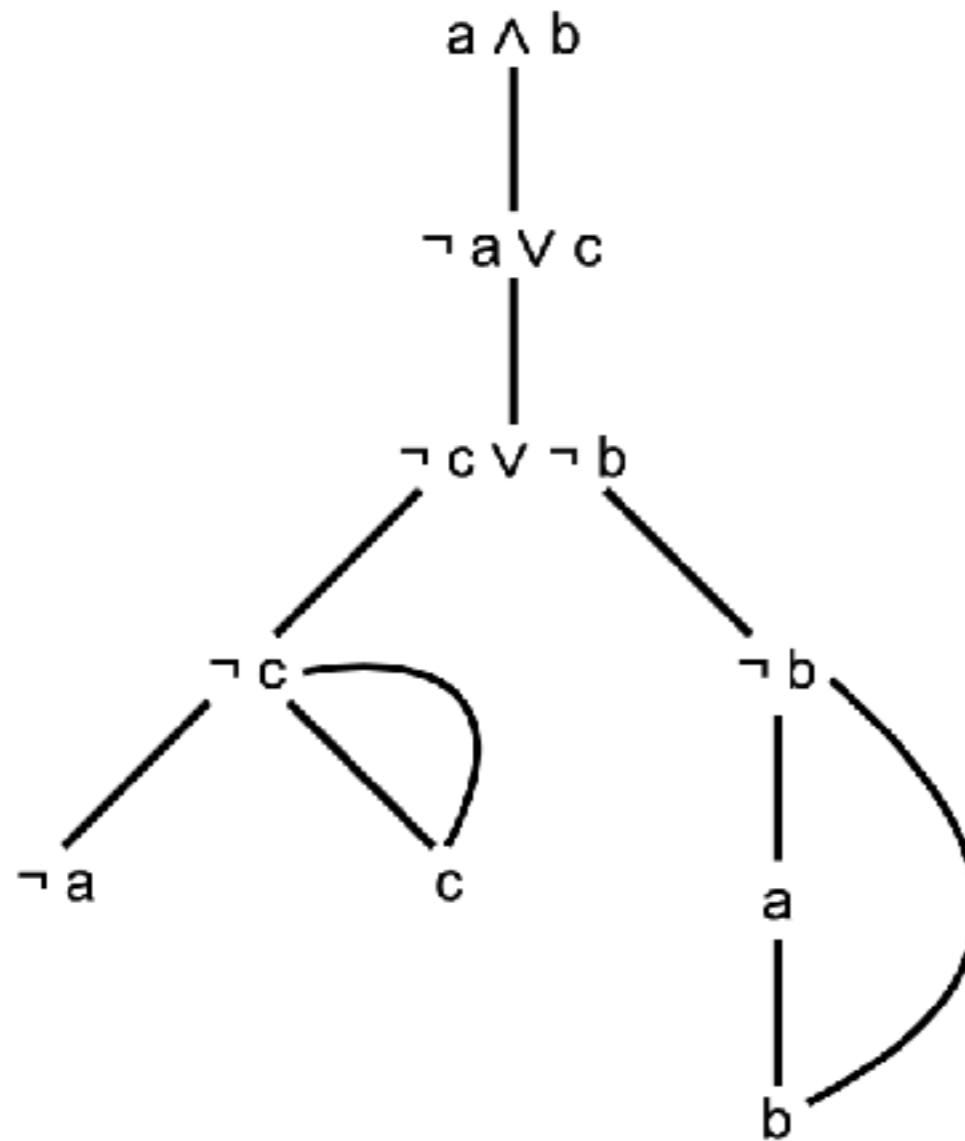
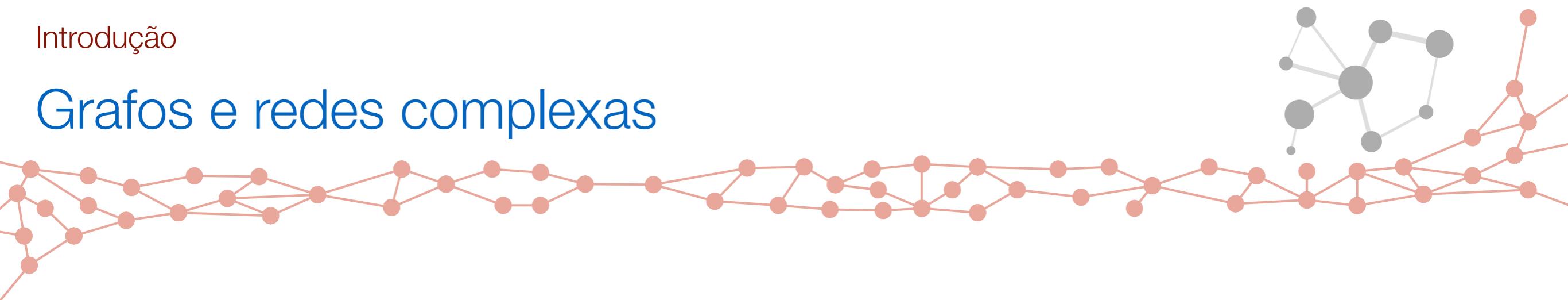
# Grafos e redes complexas



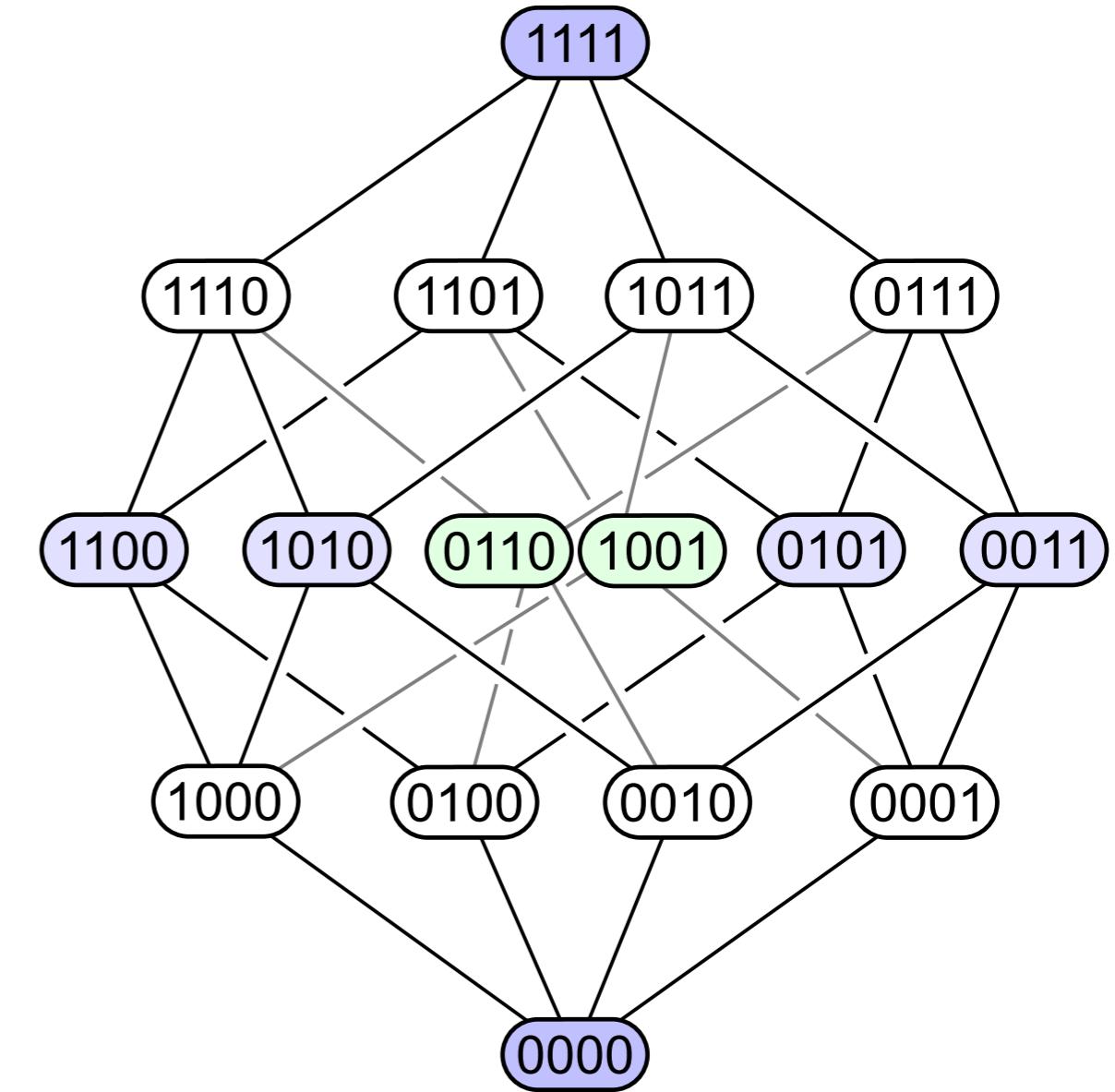
Vértices podem representar  
pesquisadores  
proteínas pessoas  
partículas

Arestas podem representar  
colaboração acadêmica  
relações de amizade  
semelhança funcional  
interações

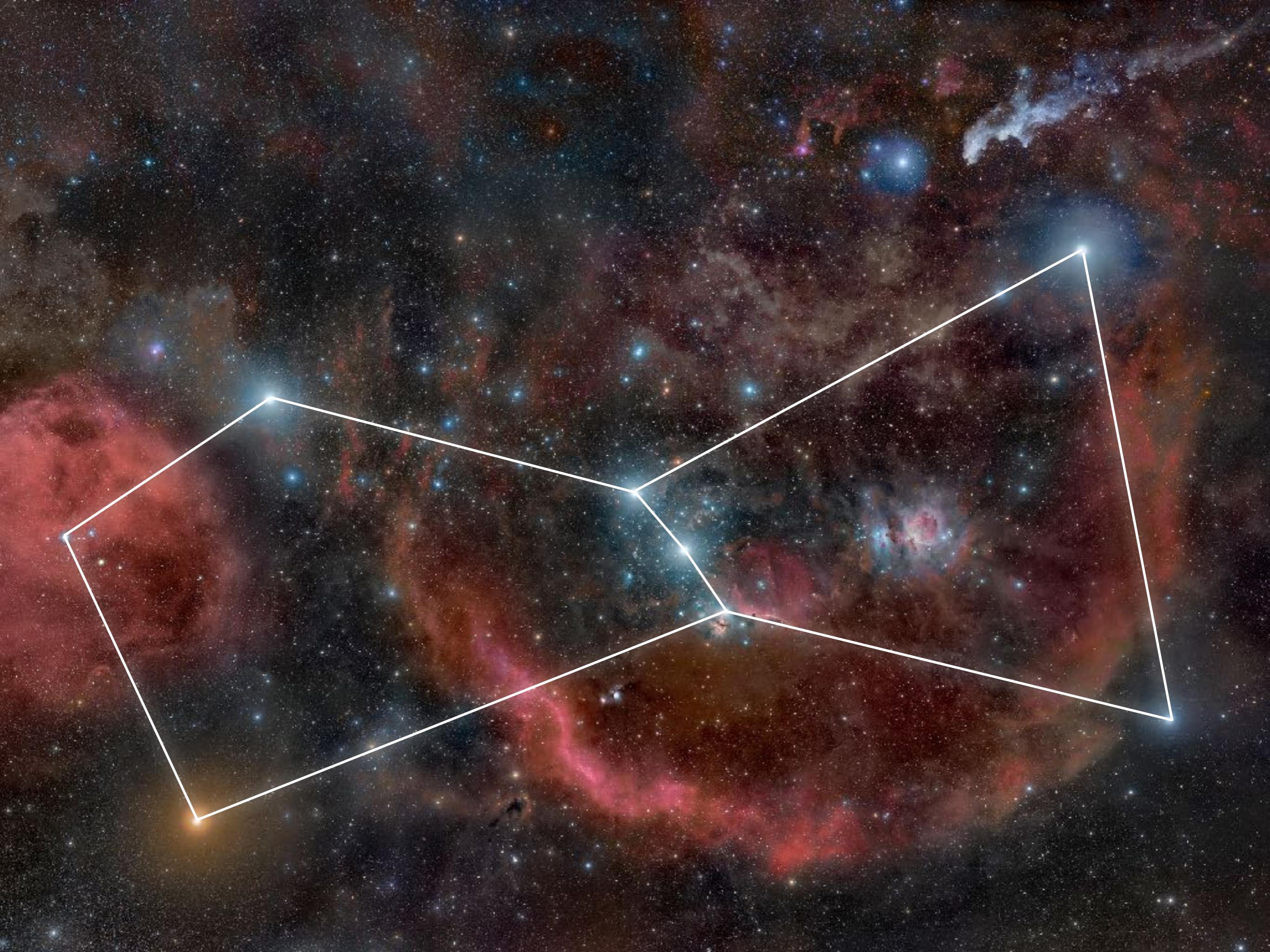
# Grafos e redes complexas

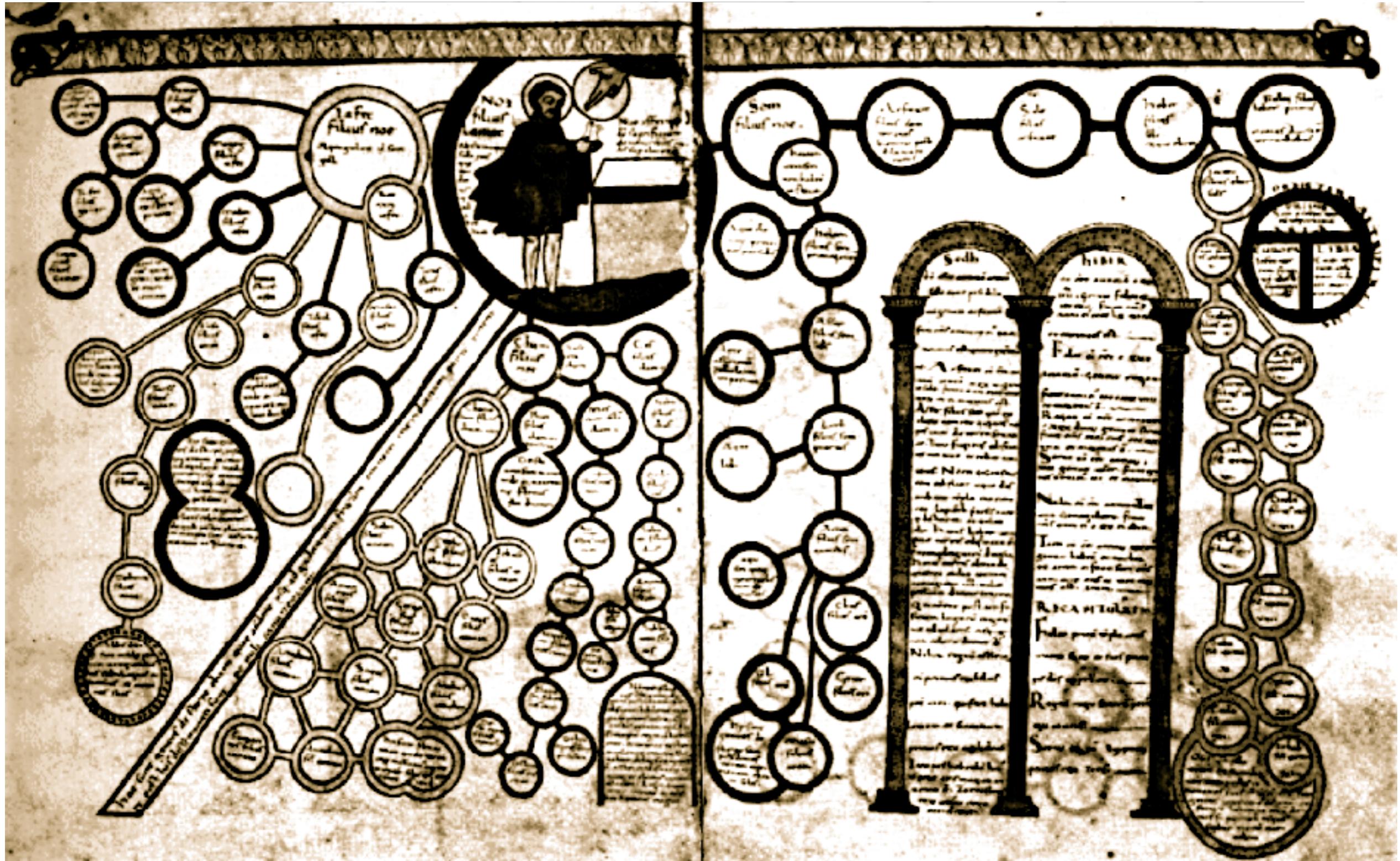


Matemática



Computação

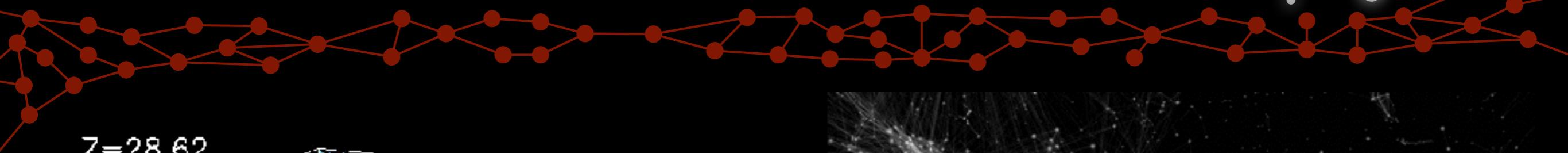




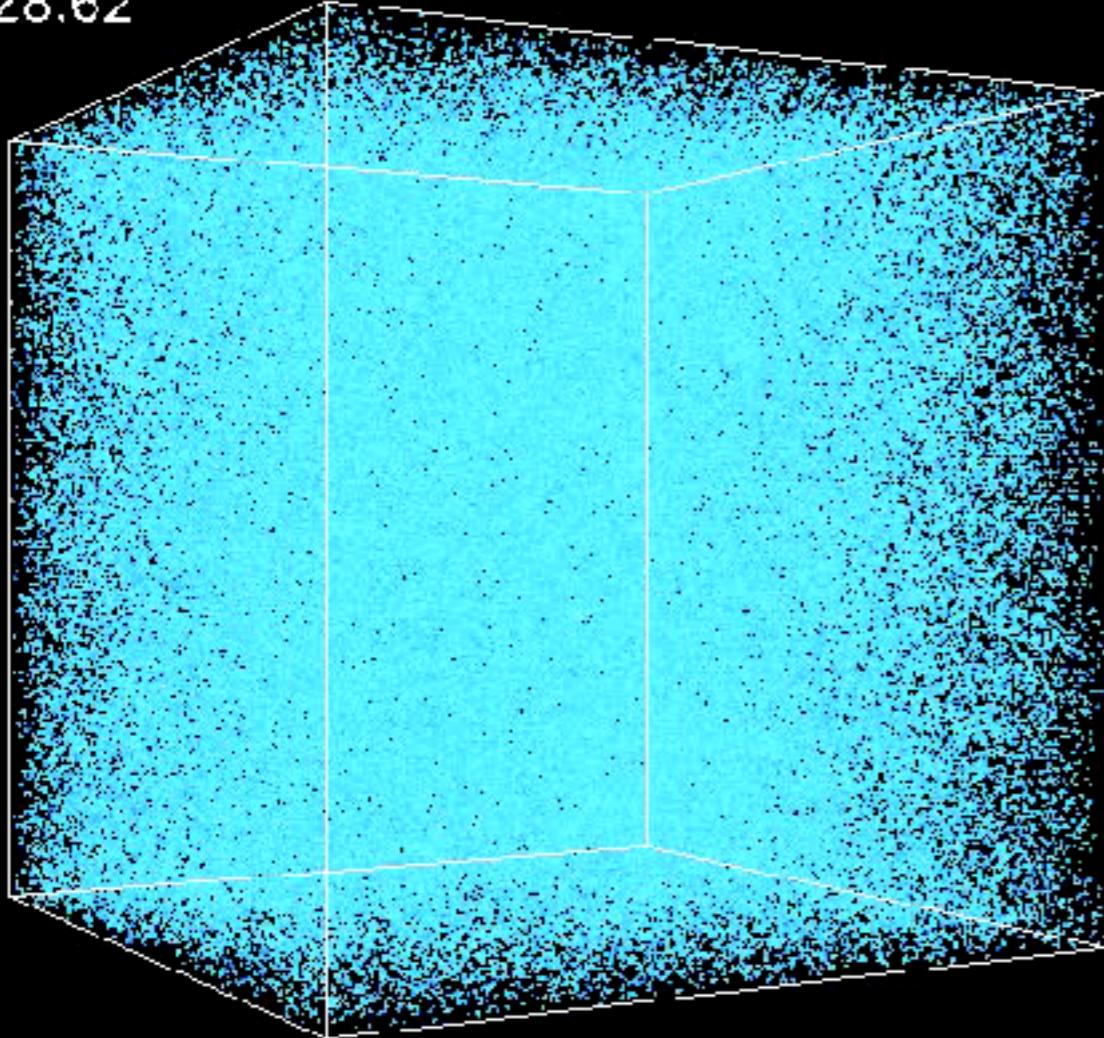
Descendentes de Noé X<sup>o</sup> séc. XI (domínio público)

Kabbalah - séc. XVI (domínio público)

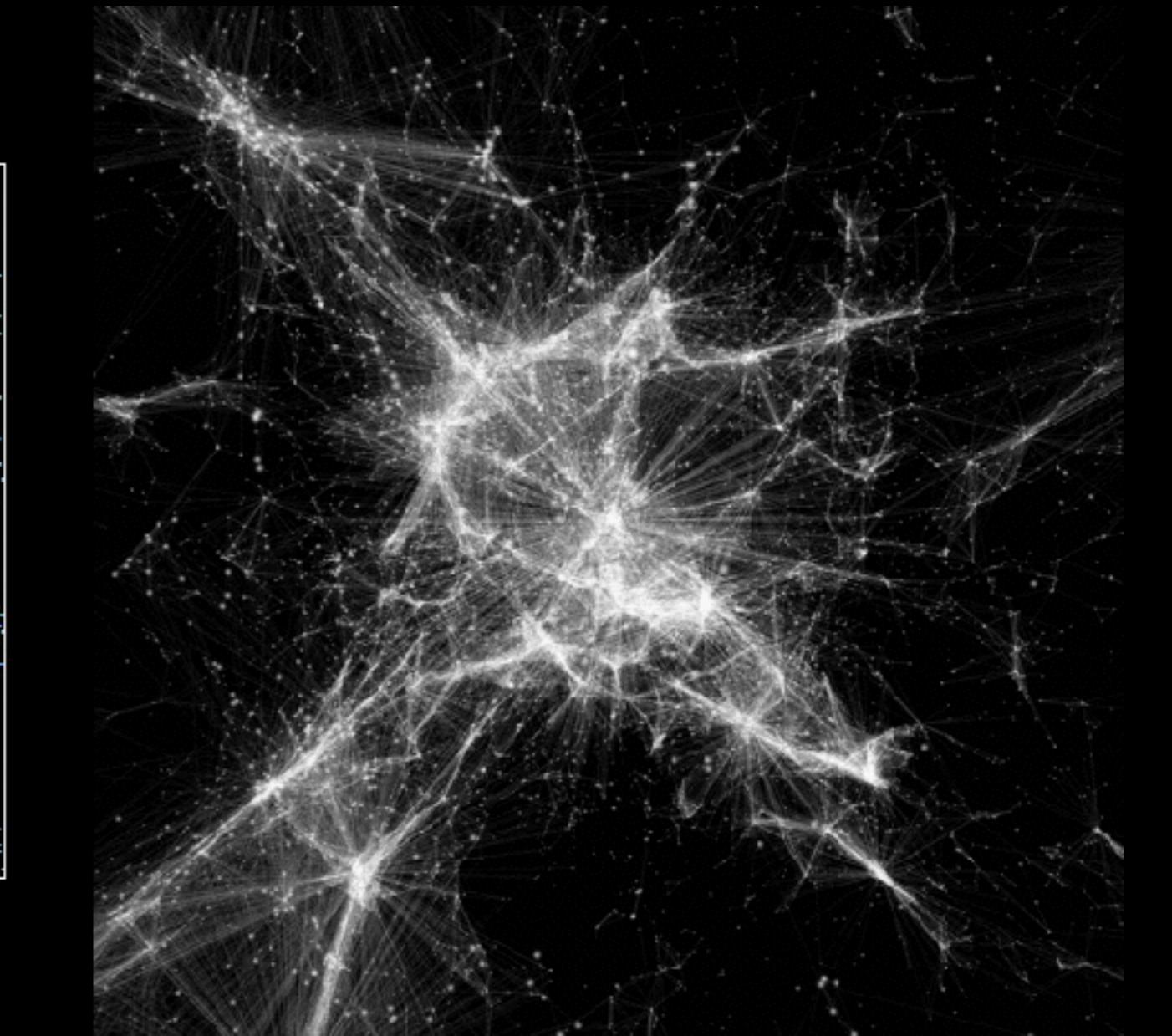
# Exemplos de redes complexas



$Z=28.62$



Simulação gerada por:  
National Center for Supercomputer Applications  
Andrey Kravtsov  
(The University of Chicago)  
e Anatoly Klypin  
(New Mexico State University).

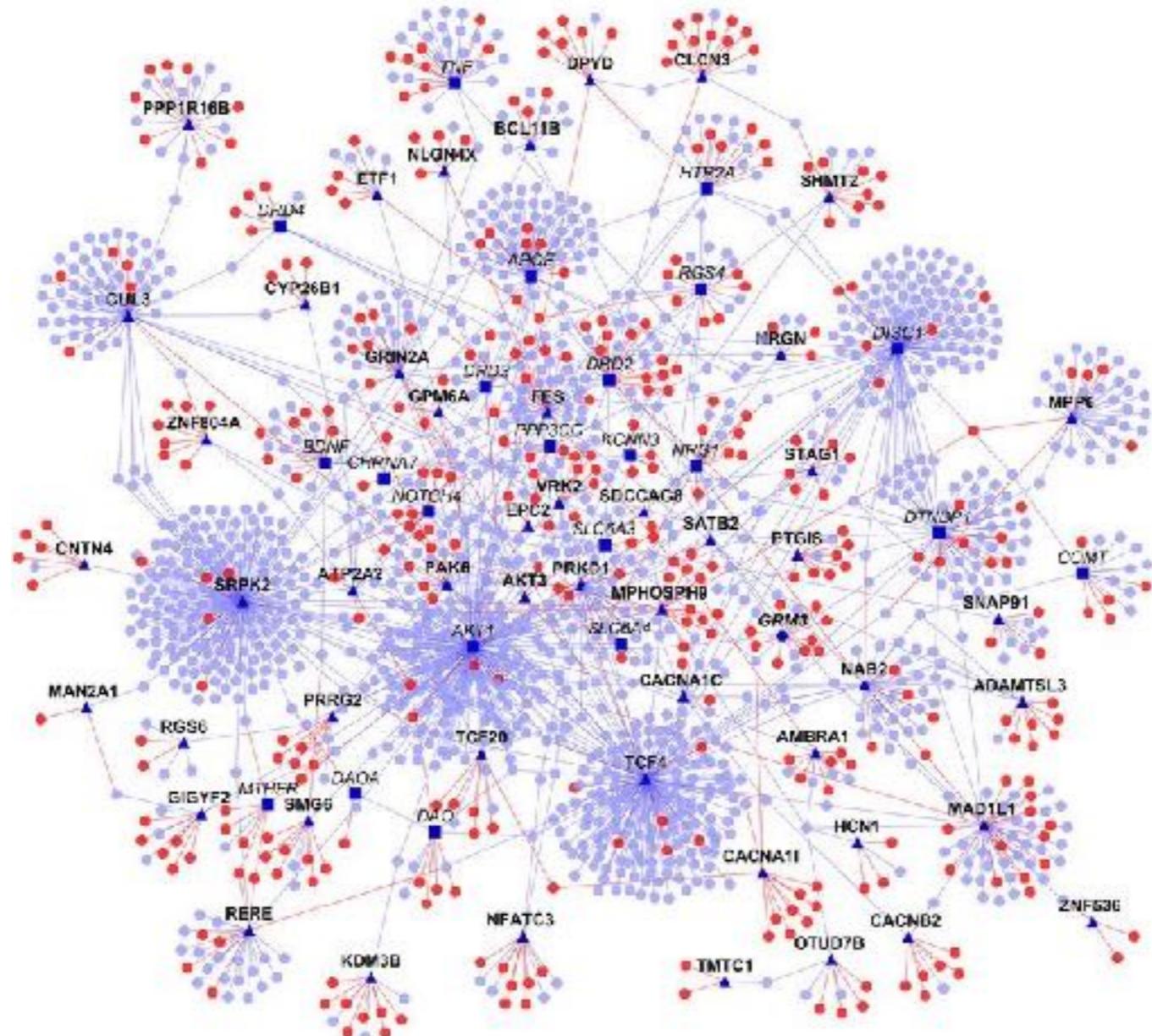


Coutinho, B. C., Hong, S., Albrecht, K., Dey, A., Barabási, A. L.,  
Torrey, P., ... & Hernquist, L. (2016). The Network Behind the  
Cosmic Web. *arXiv preprint arXiv:1604.03236*.

## Exemplos de redes complexas



Interação entre proteínas

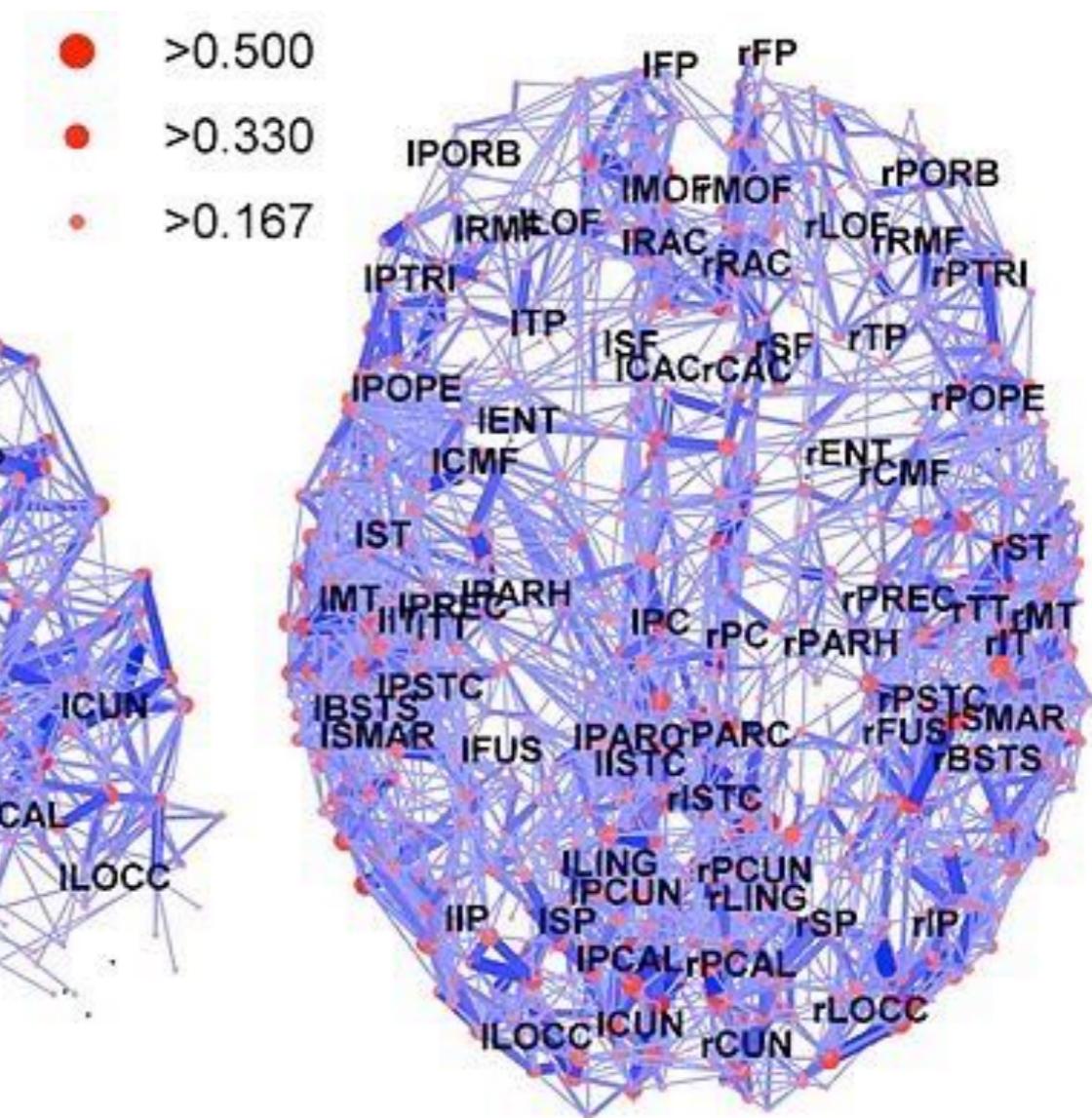
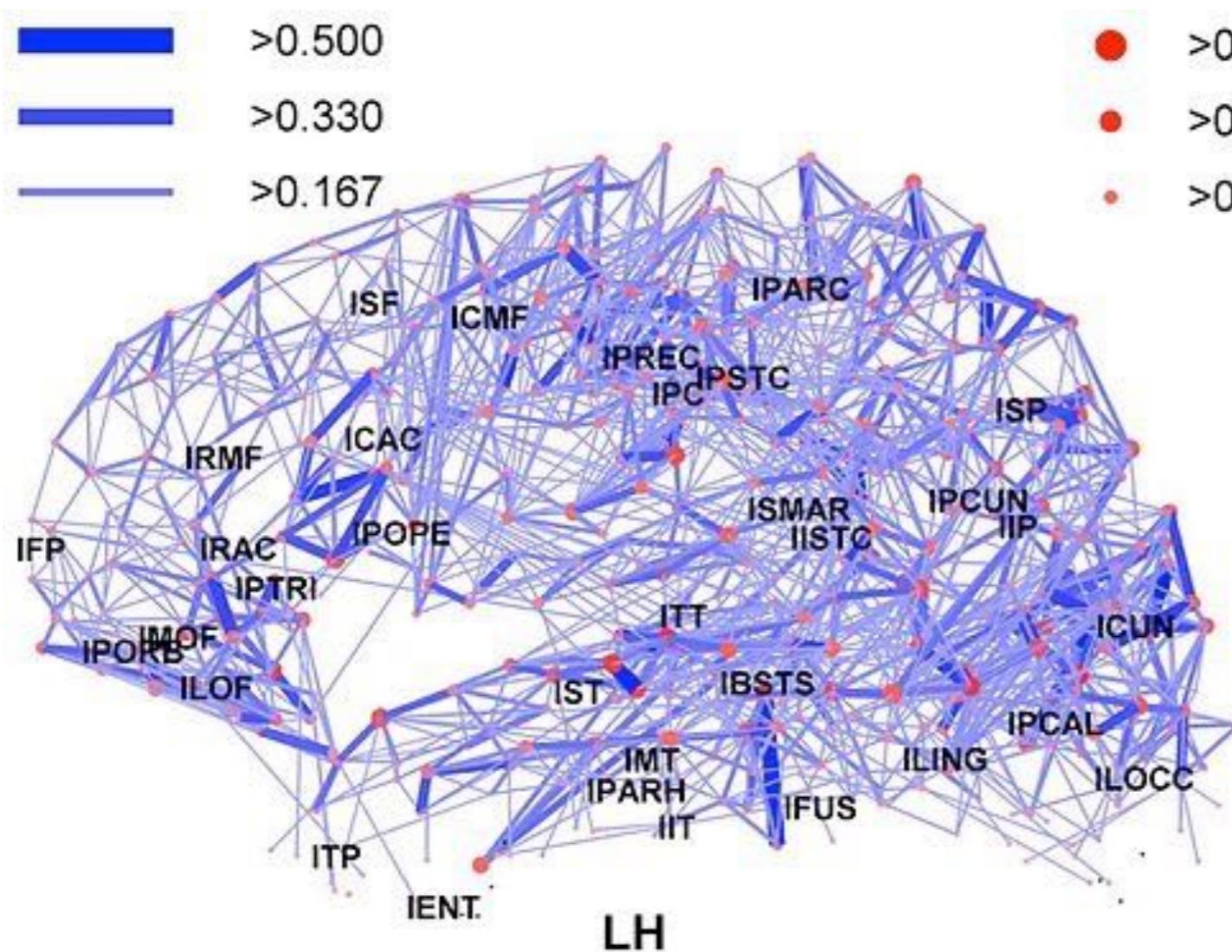


Ganapathiraju, Madhavi K., et al. "Schizophrenia interactome with 504 novel protein–protein interactions." *npj Schizophrenia* 2 (2016): 16012.

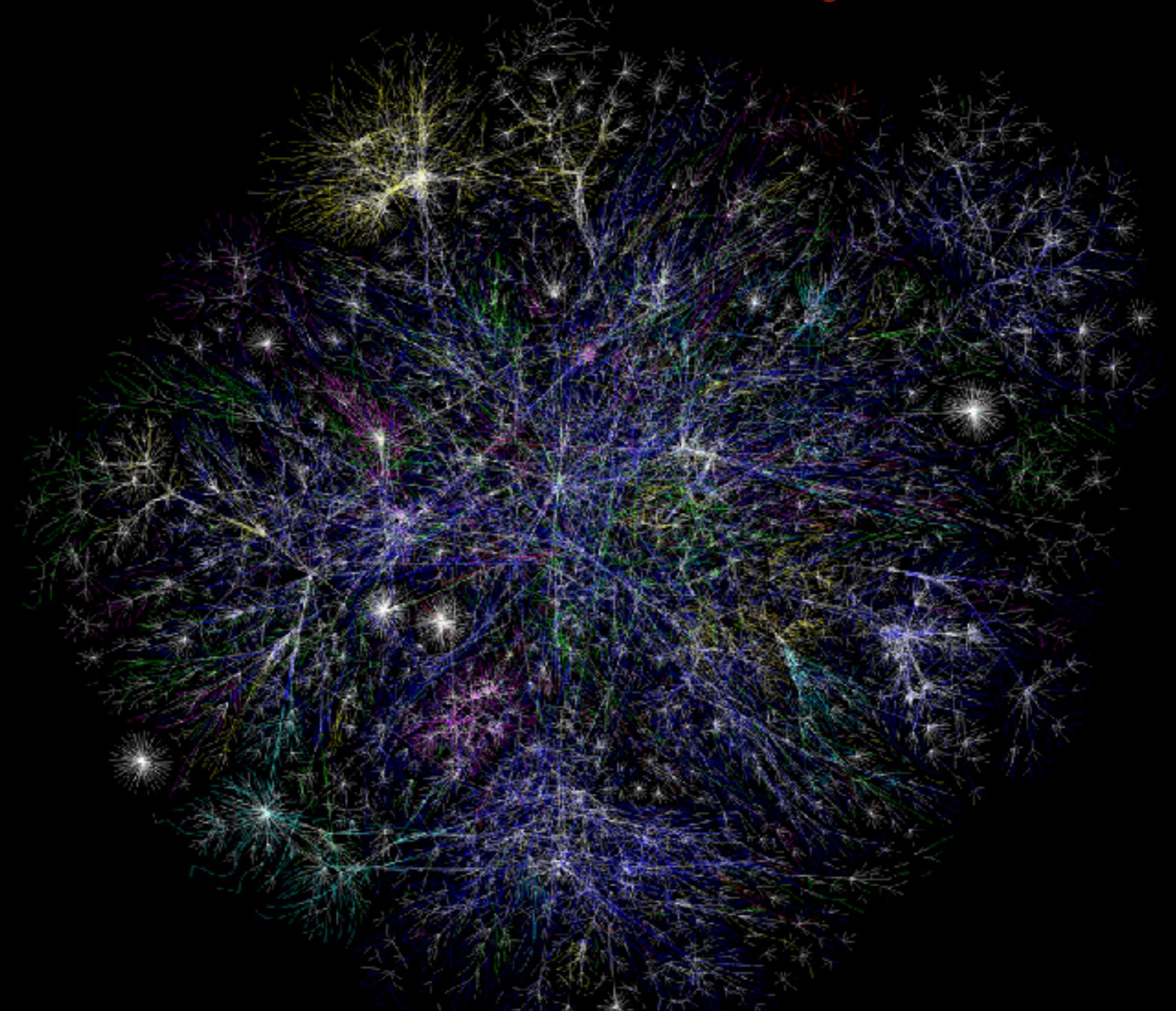
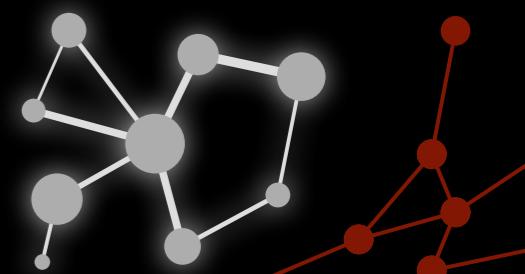
## Exemplos de redes complexas



Relação entre regiões corticais



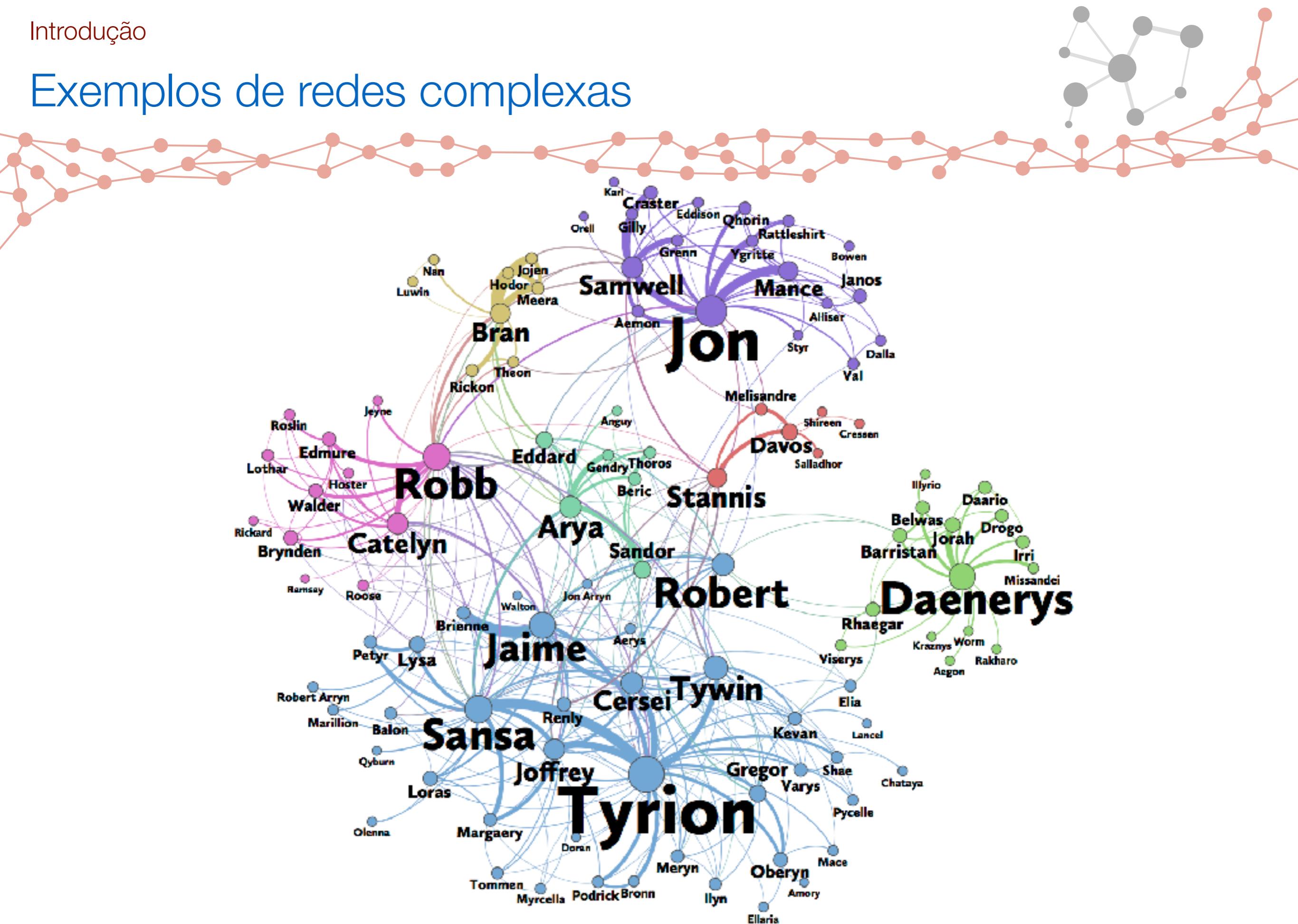
# Exemplos de redes complexas



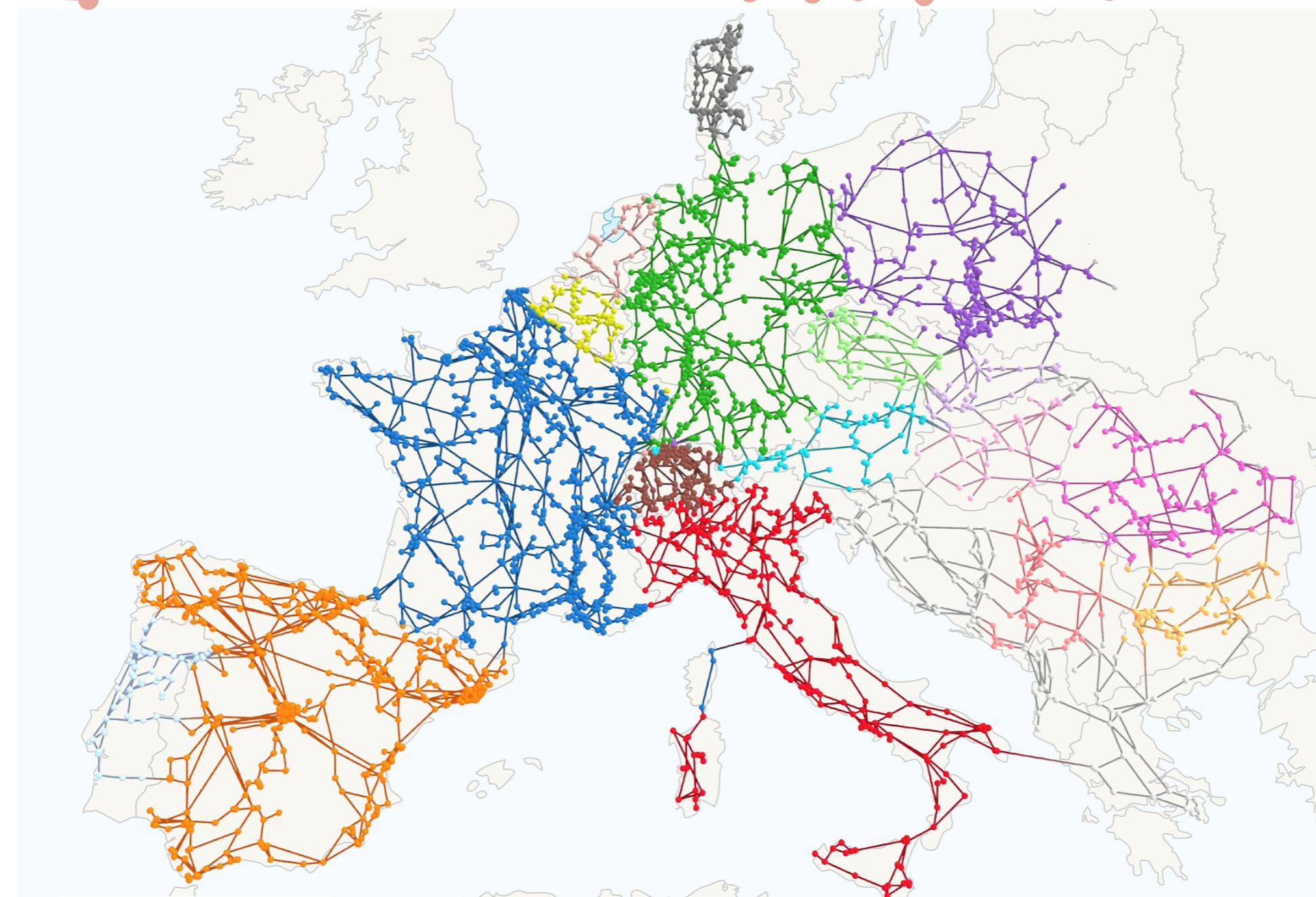
The Internet

The opte project: <http://opte.org/>

# Exemplos de redes complexas

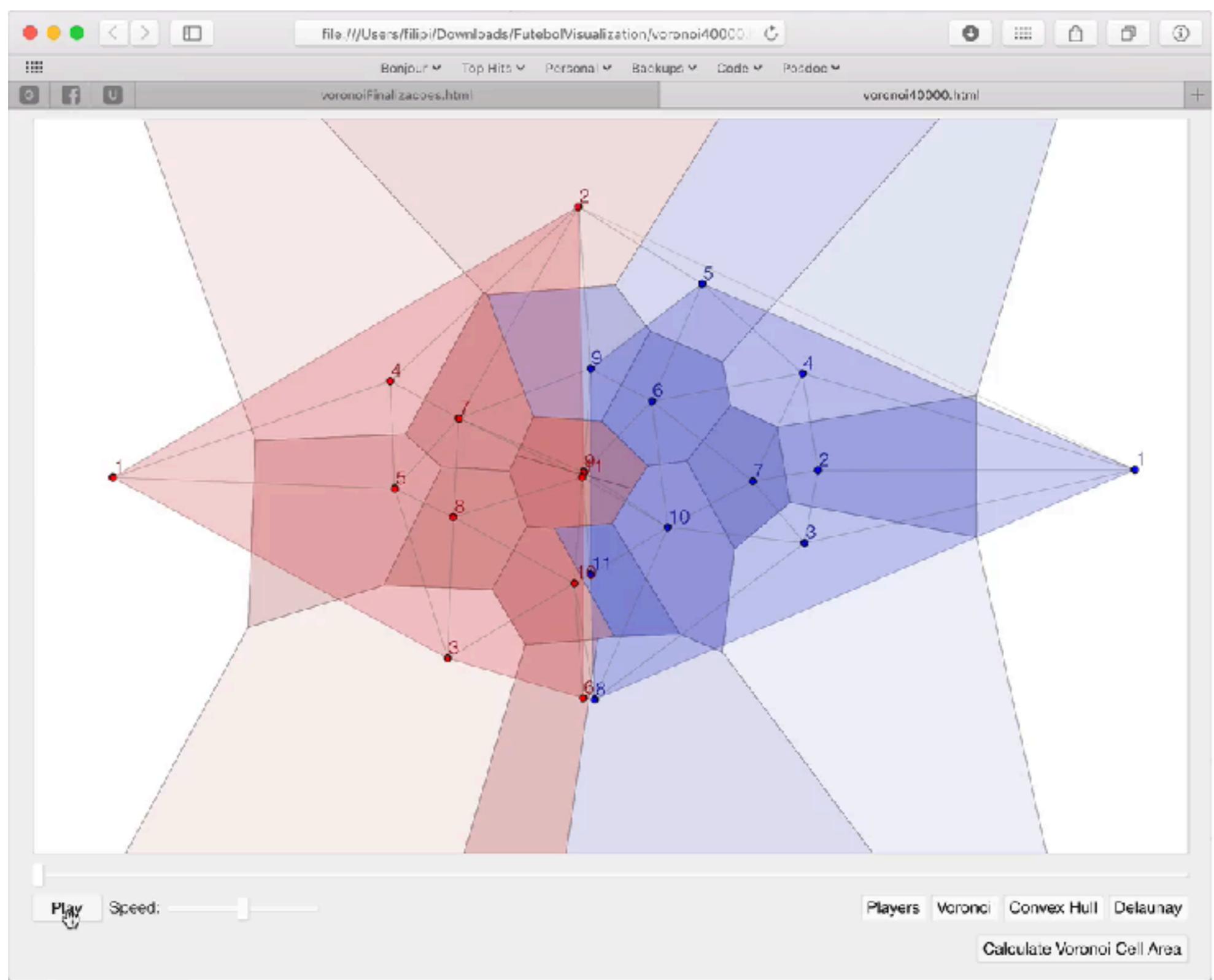


# Exemplos de redes complexas



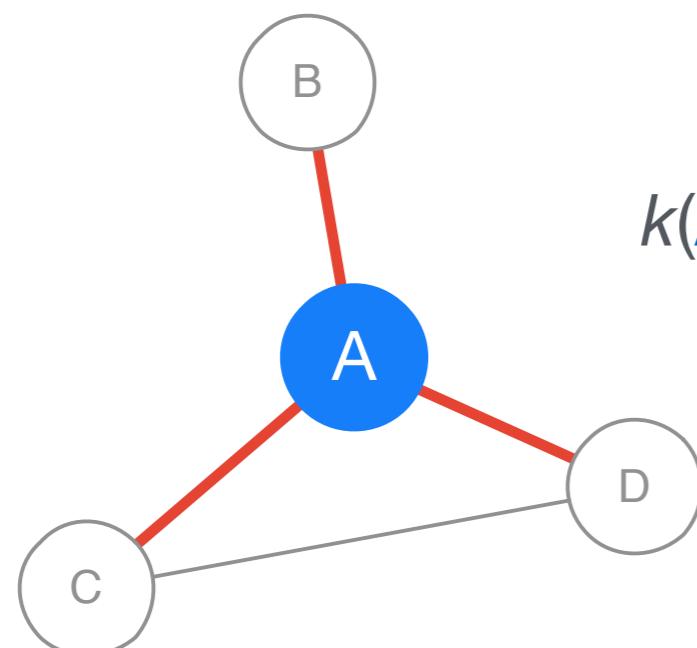
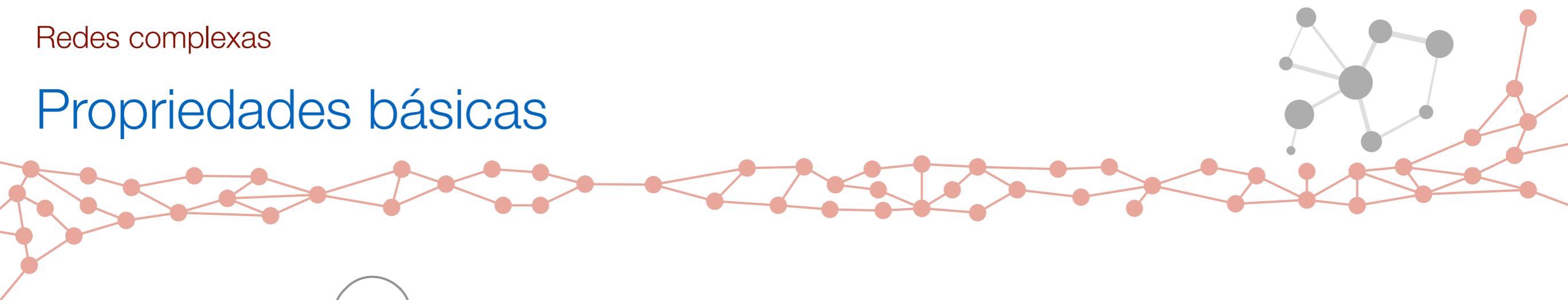
France	Poland	Belgium	Czech, Slovakia	Hungary
Spain	Switzerland	Austria	Serbia	Others
Germany	Romania	Portugal	Slovenia	
Italy	Denmark	Bulgaria	Netherlands	

# Exemplos de redes complexas





# Propriedades básicas



Grau (ou conectividade)

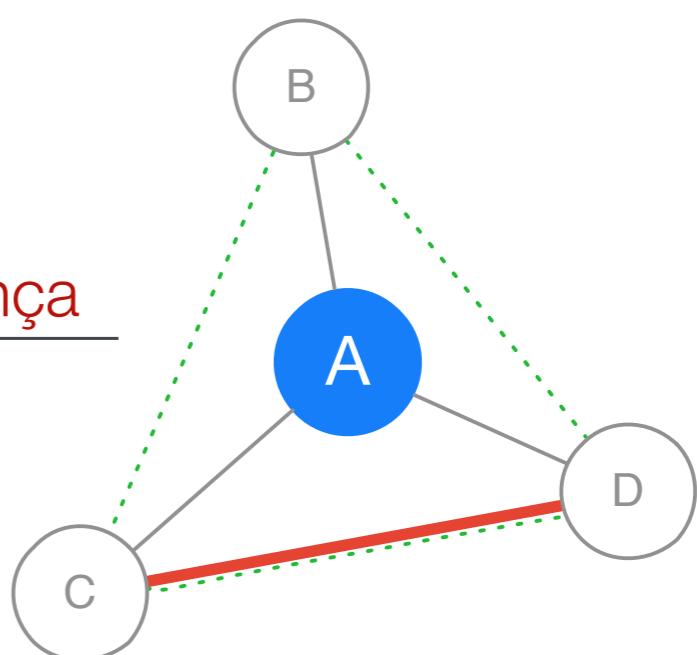
$k(A)$  = número de conexões do vértice  $A$ .

$$k(A) = 3$$

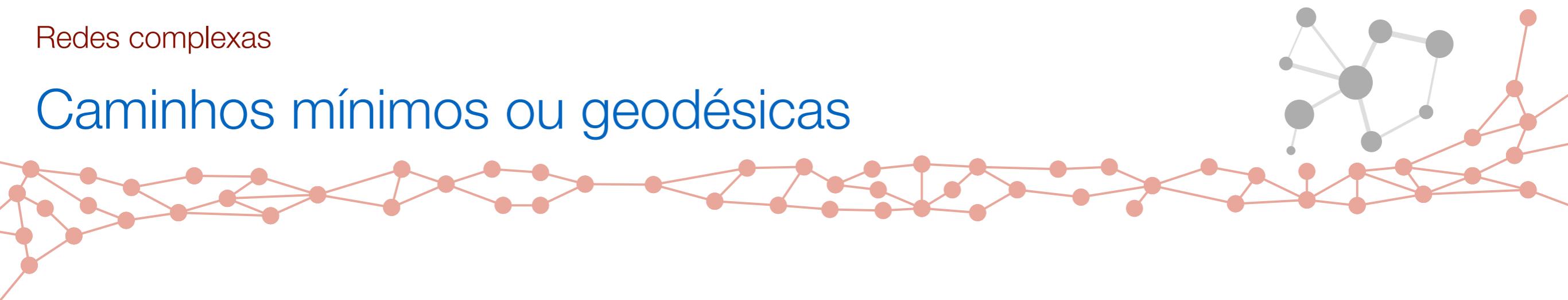
Coeficiente de Aglomeração

$$Cc(A) = \frac{\text{número de conexões na vizinhança}}{\text{número de trios possíveis}}$$

$$Cc(A) = 2 \frac{1}{3(3-1)} = \frac{1}{3}$$

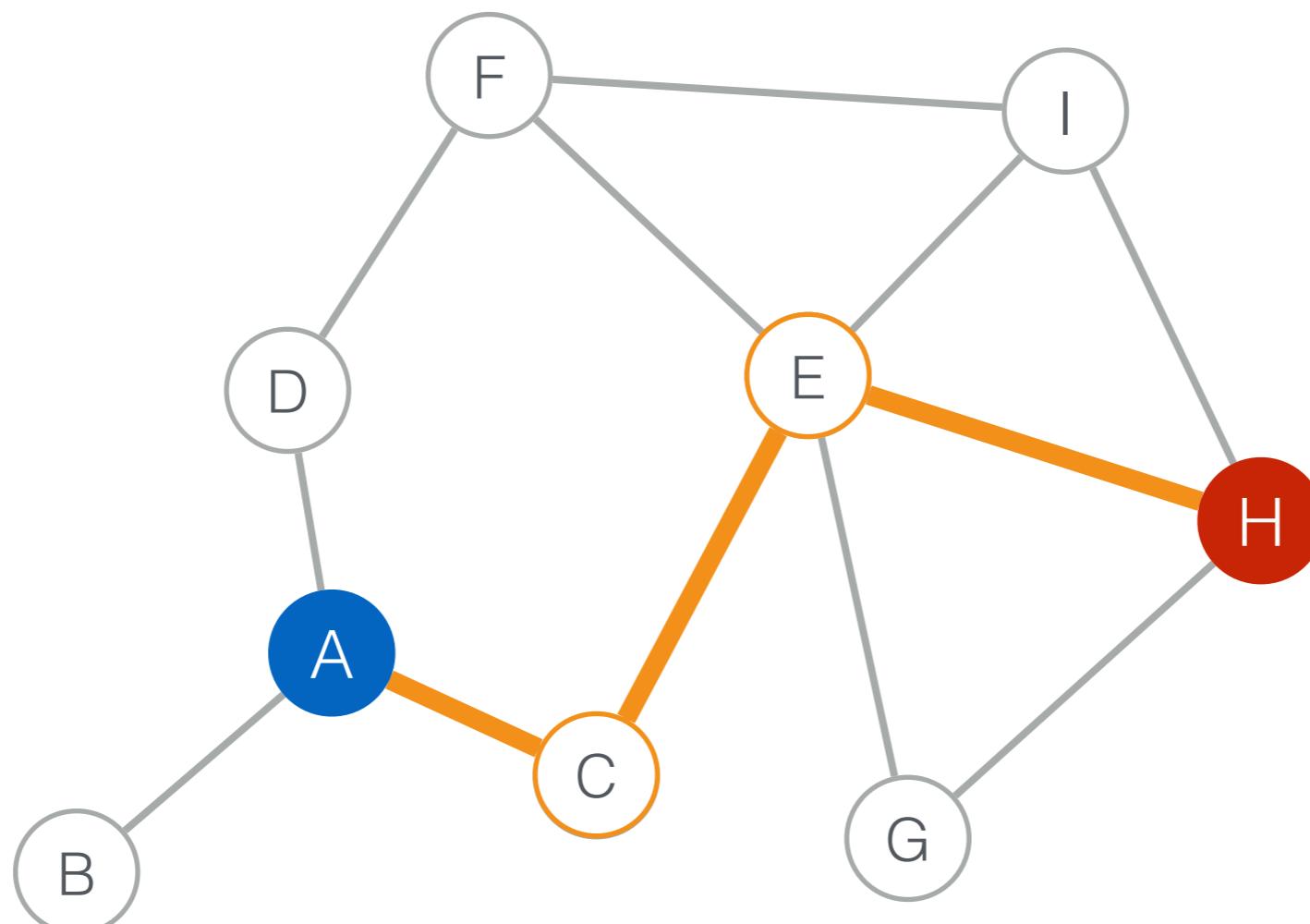


# Caminhos mínimos ou geodésicas



$g(A, H) = \text{distância mínima, em arestas, entre dois vértices}$

$$g(A, H) = 3$$

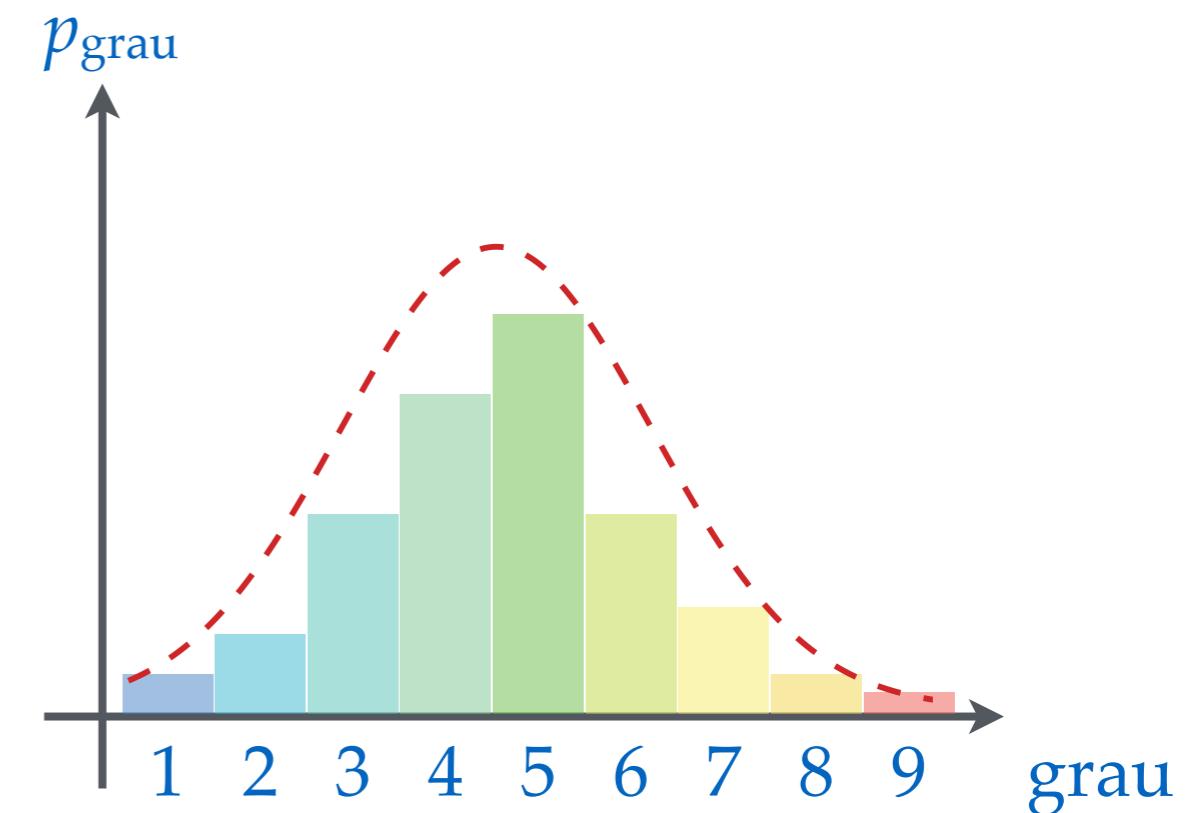
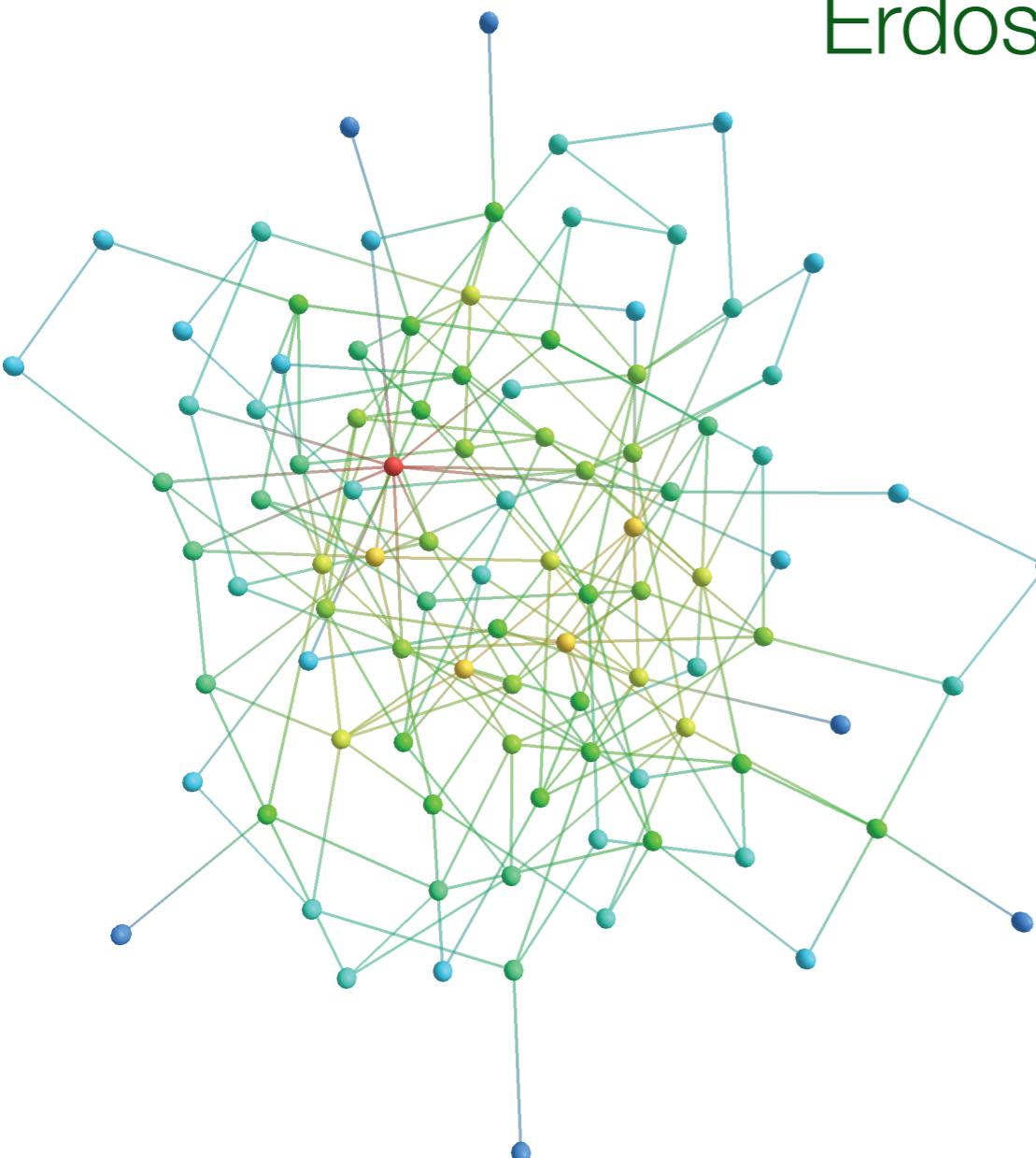


Redes complexas

## Modelo ER

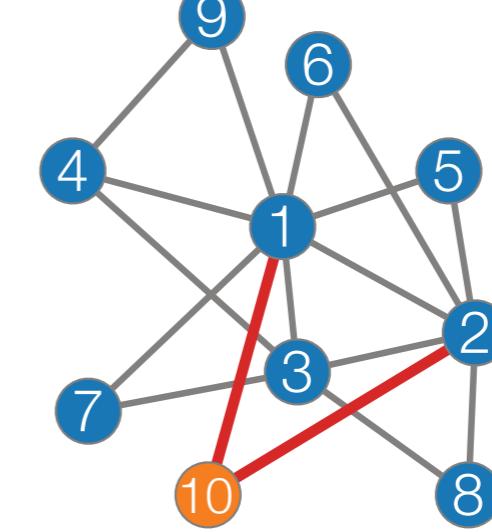
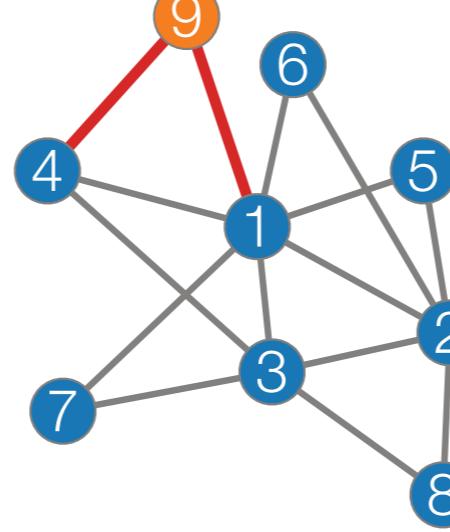
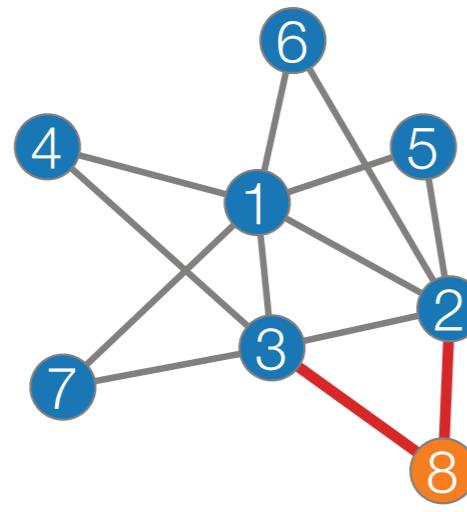
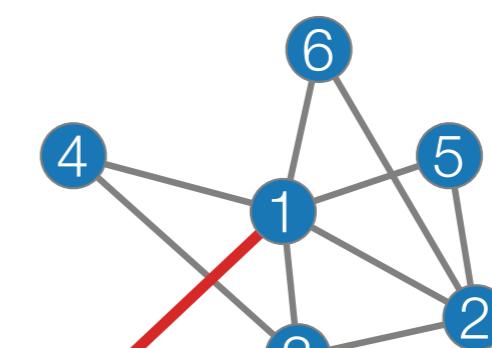
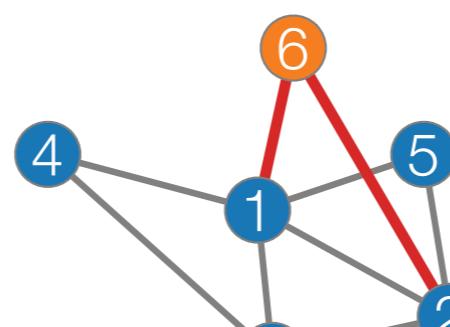
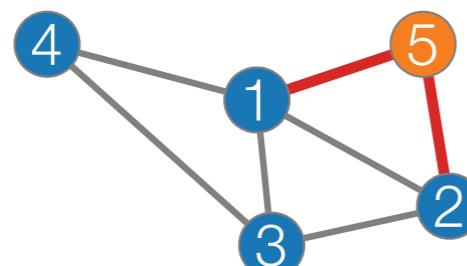
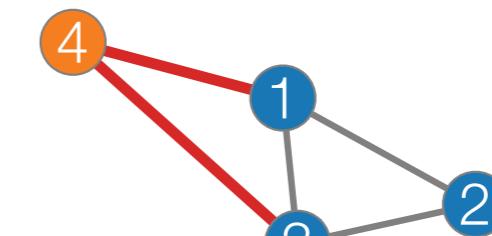
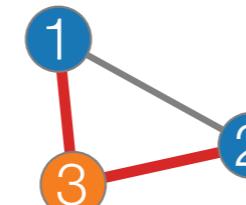
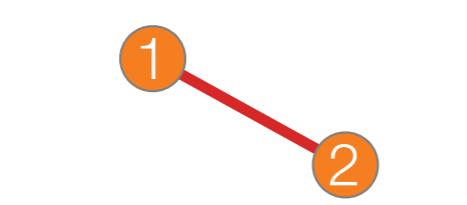


Erdös-Rényi (ER)



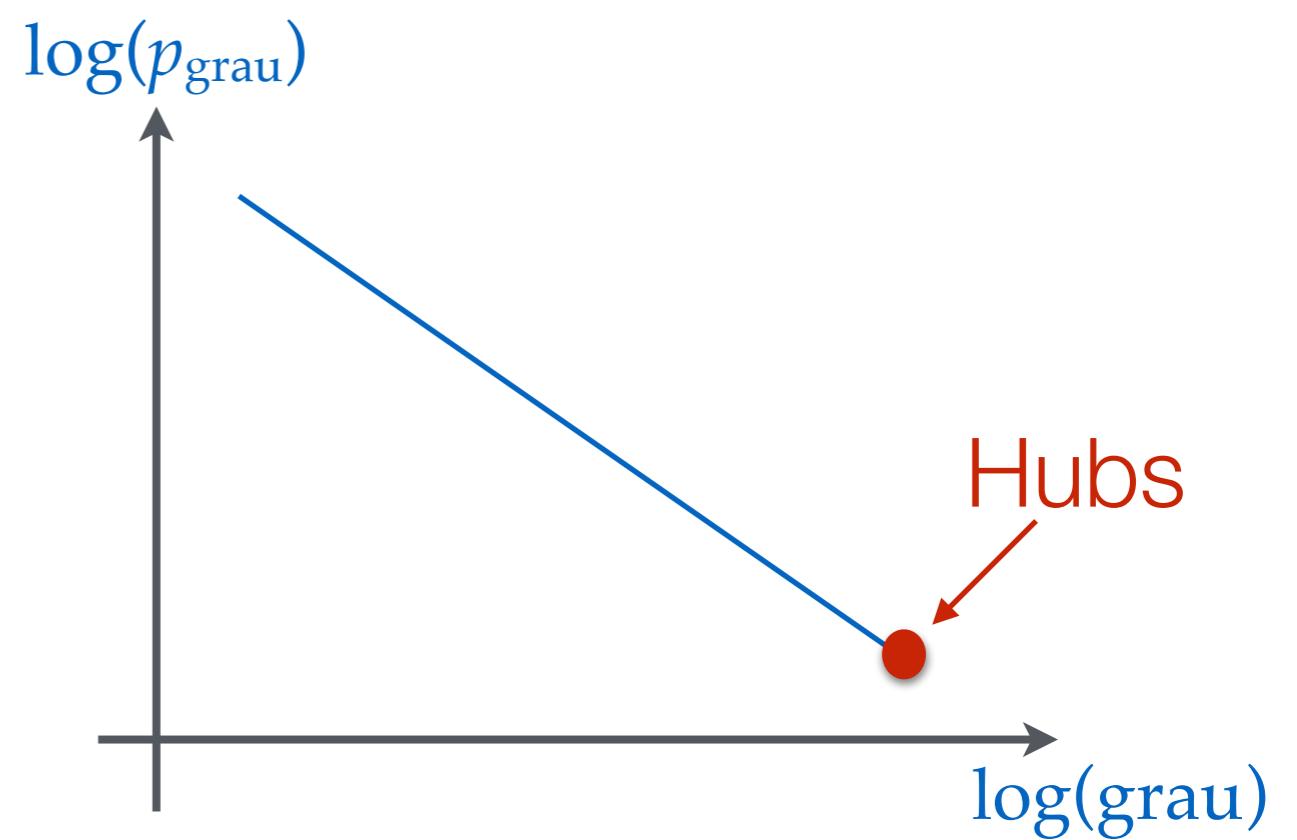
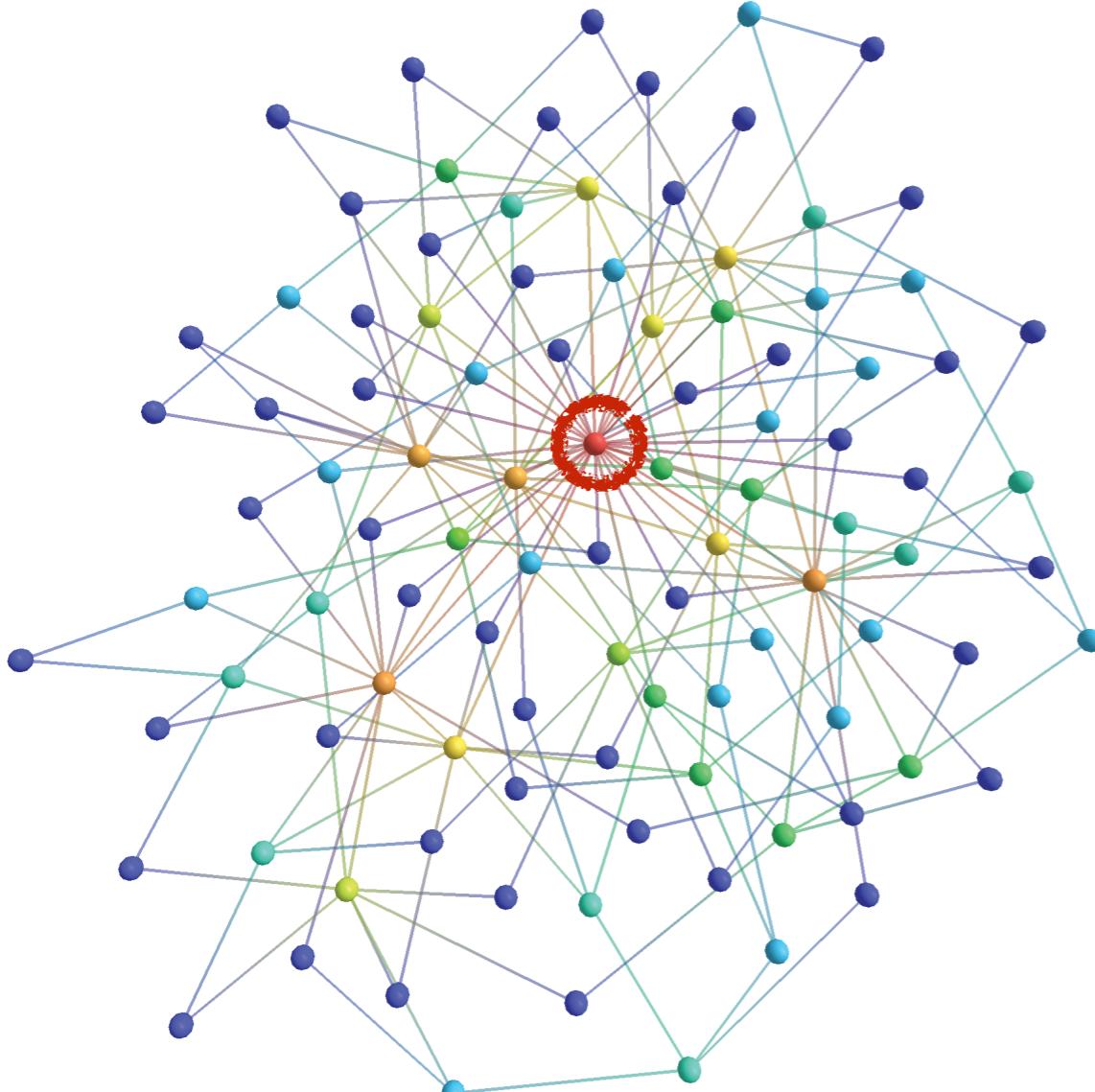
## Modelo BA

## Barabási-Albert (BA)

(a)  $t=0$ (d)  $t=3$ (g)  $t=6$ (b)  $t=1$ (e)  $t=4$ (h)  $t=7$ (c)  $t=2$ (f)  $t=5$ (i)  $t=8$ 

## Modelo BA

Barabási-Albert (BA)

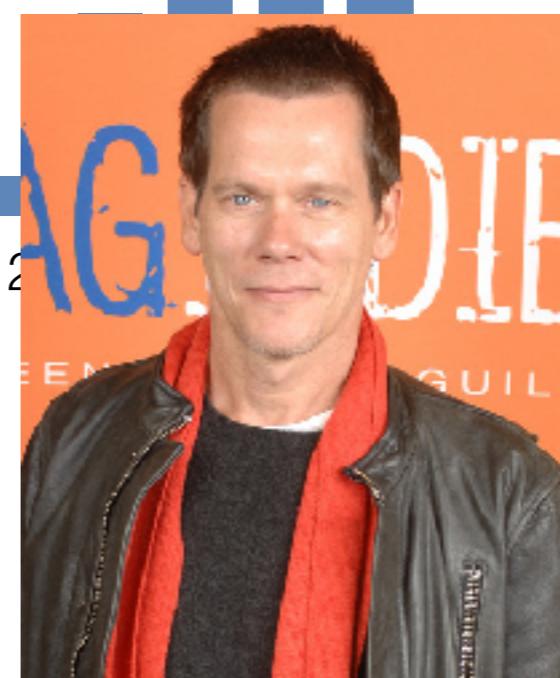
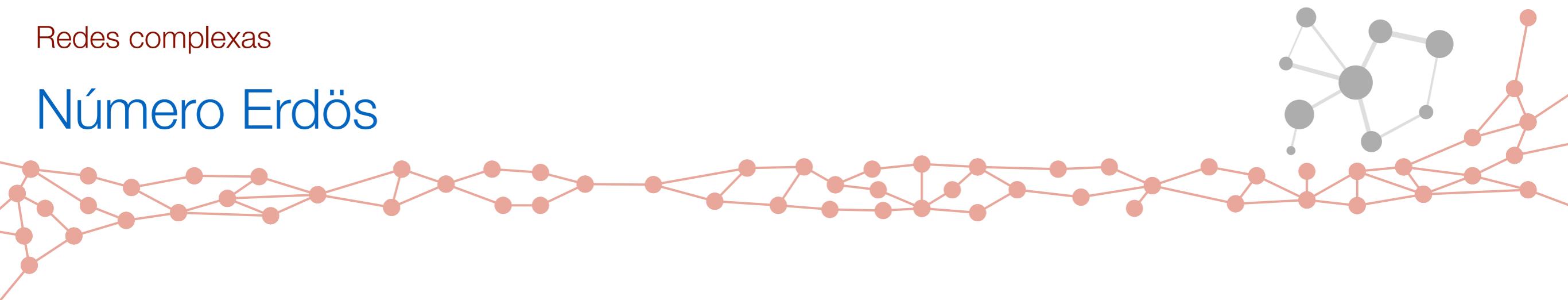


# Fenômeno pequeno mundo



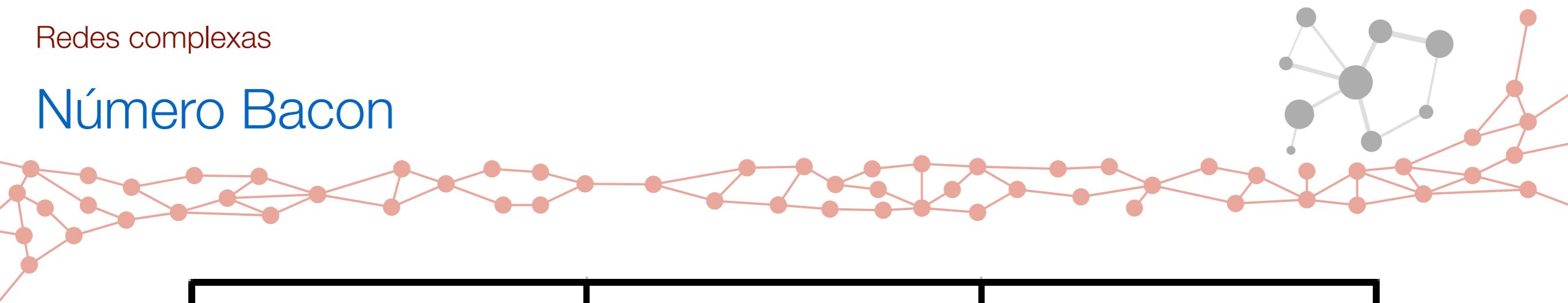
Redes complexas

## Número Erdős

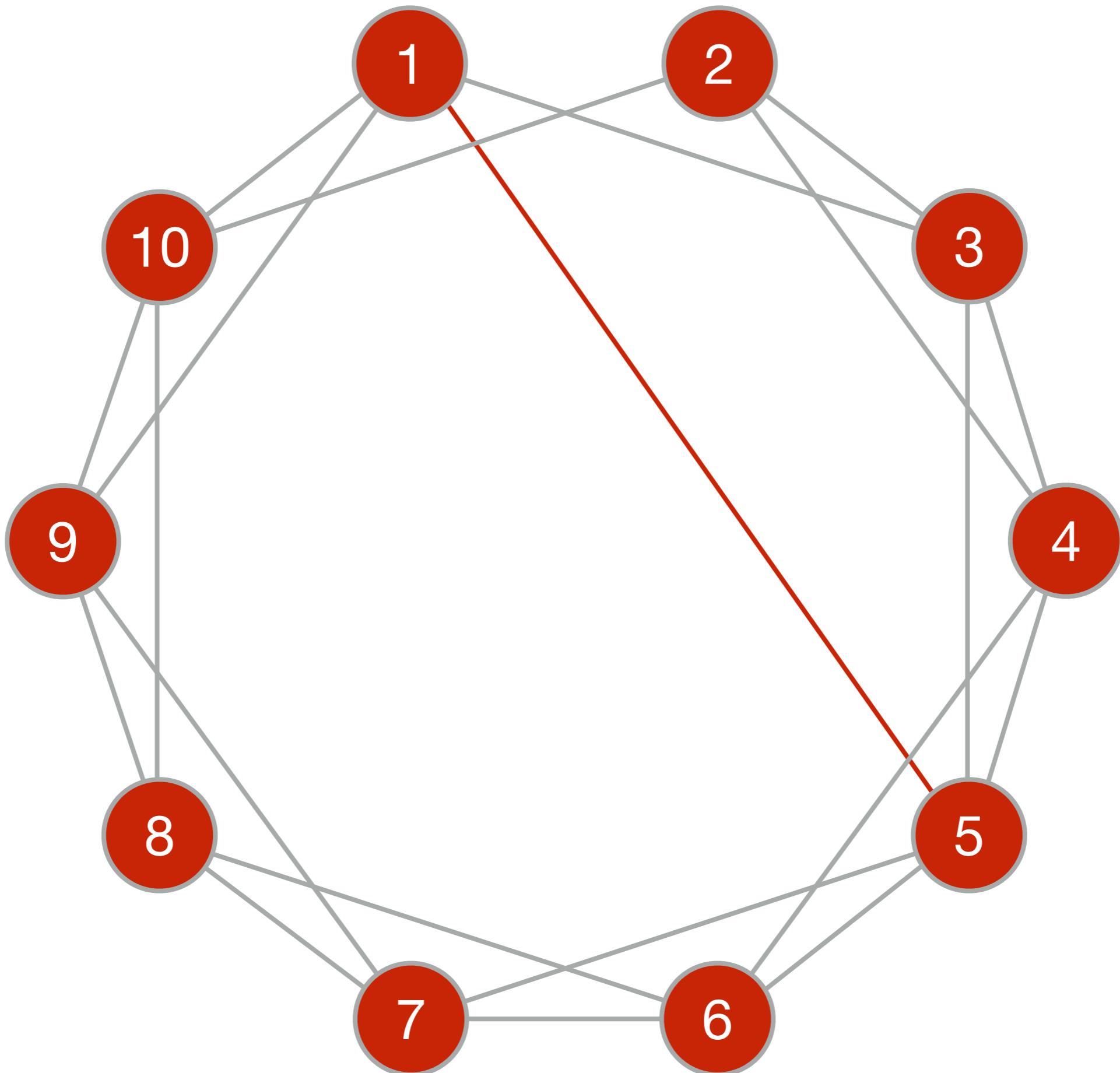


<http://oracleofbacon.org/>

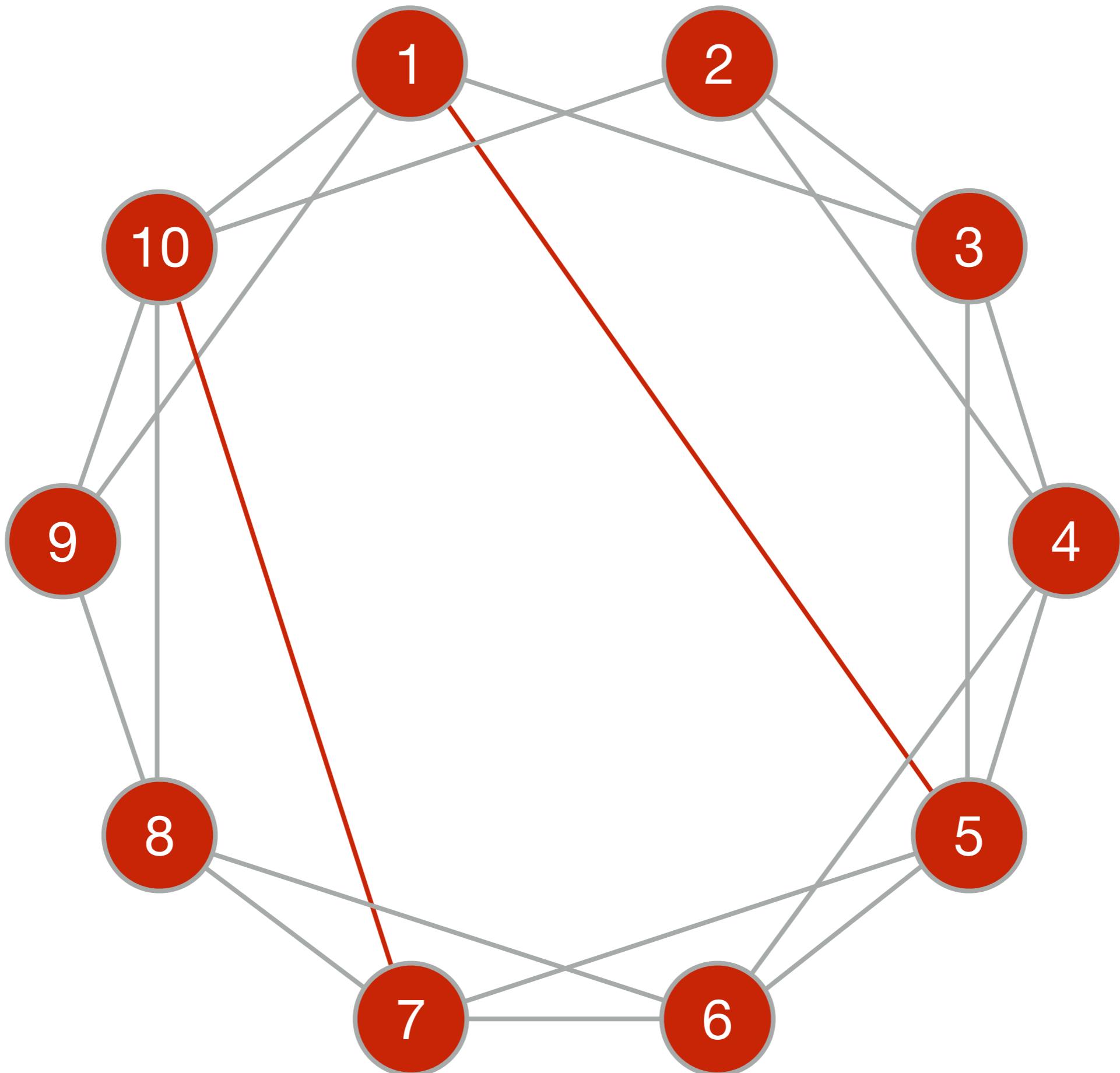
# Número Bacon



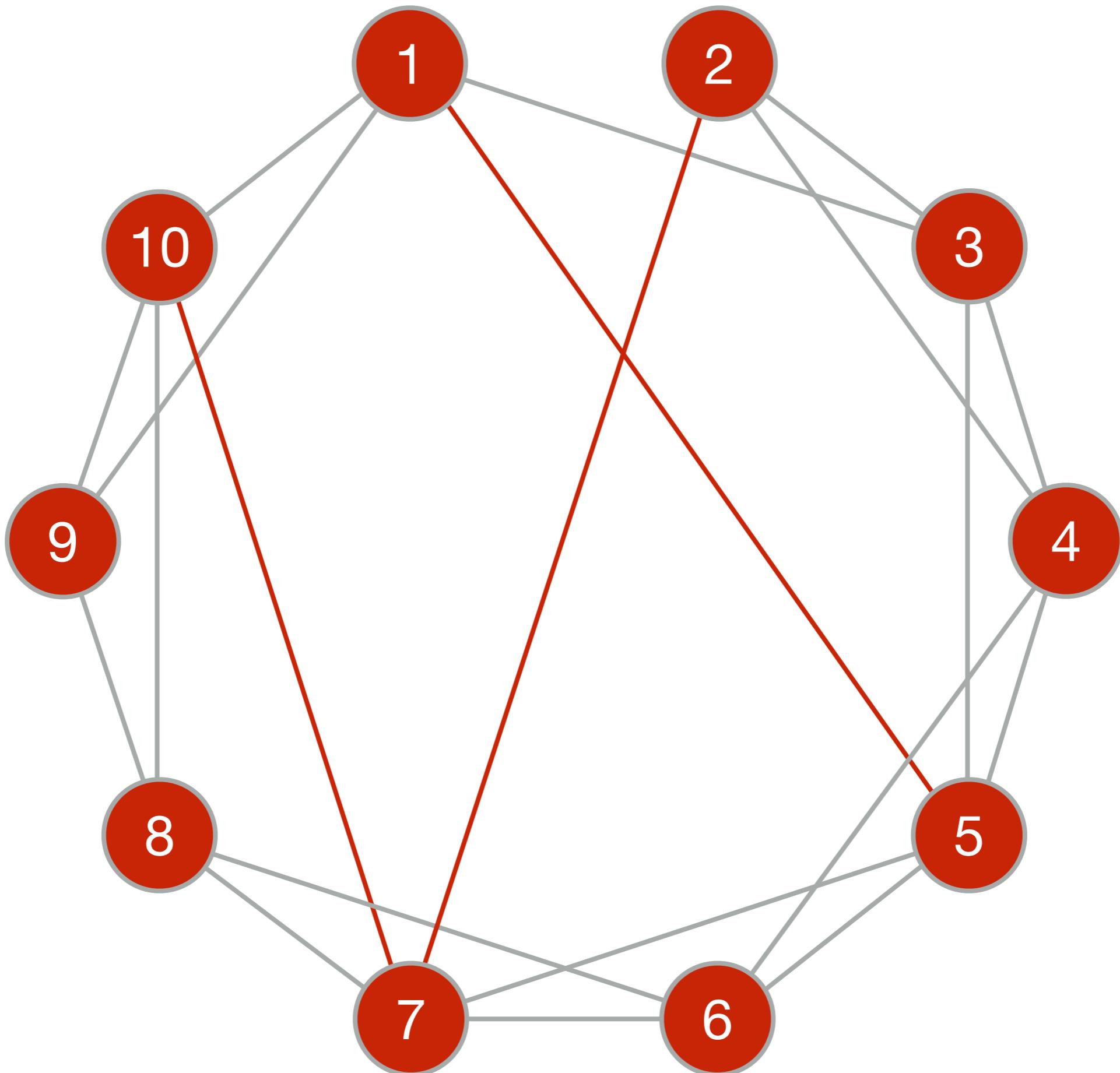
Adaptado de: <http://explosm.net/comics/689/>



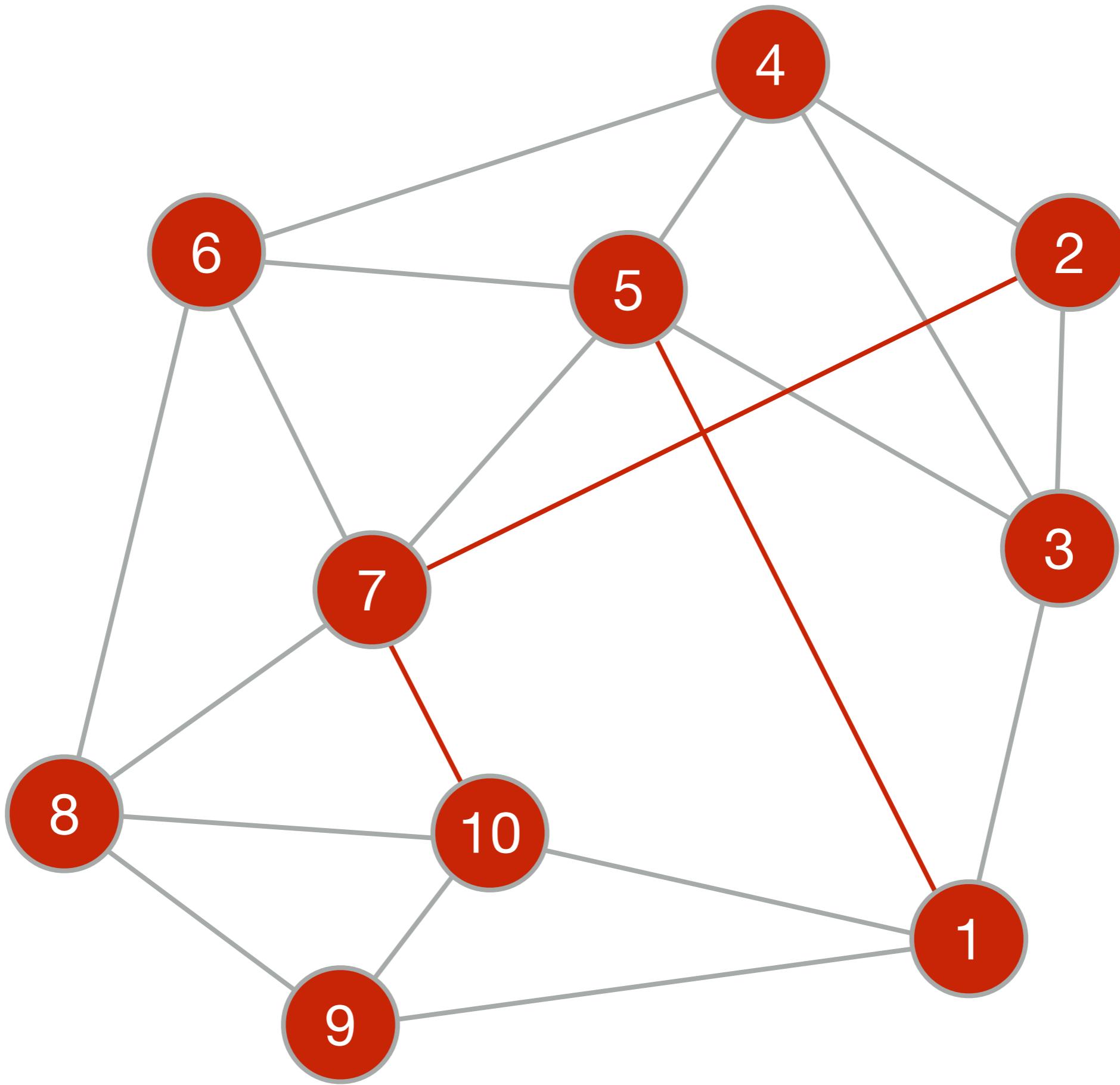
Watts-Strogatz 1D



Watts-Strogatz 1D

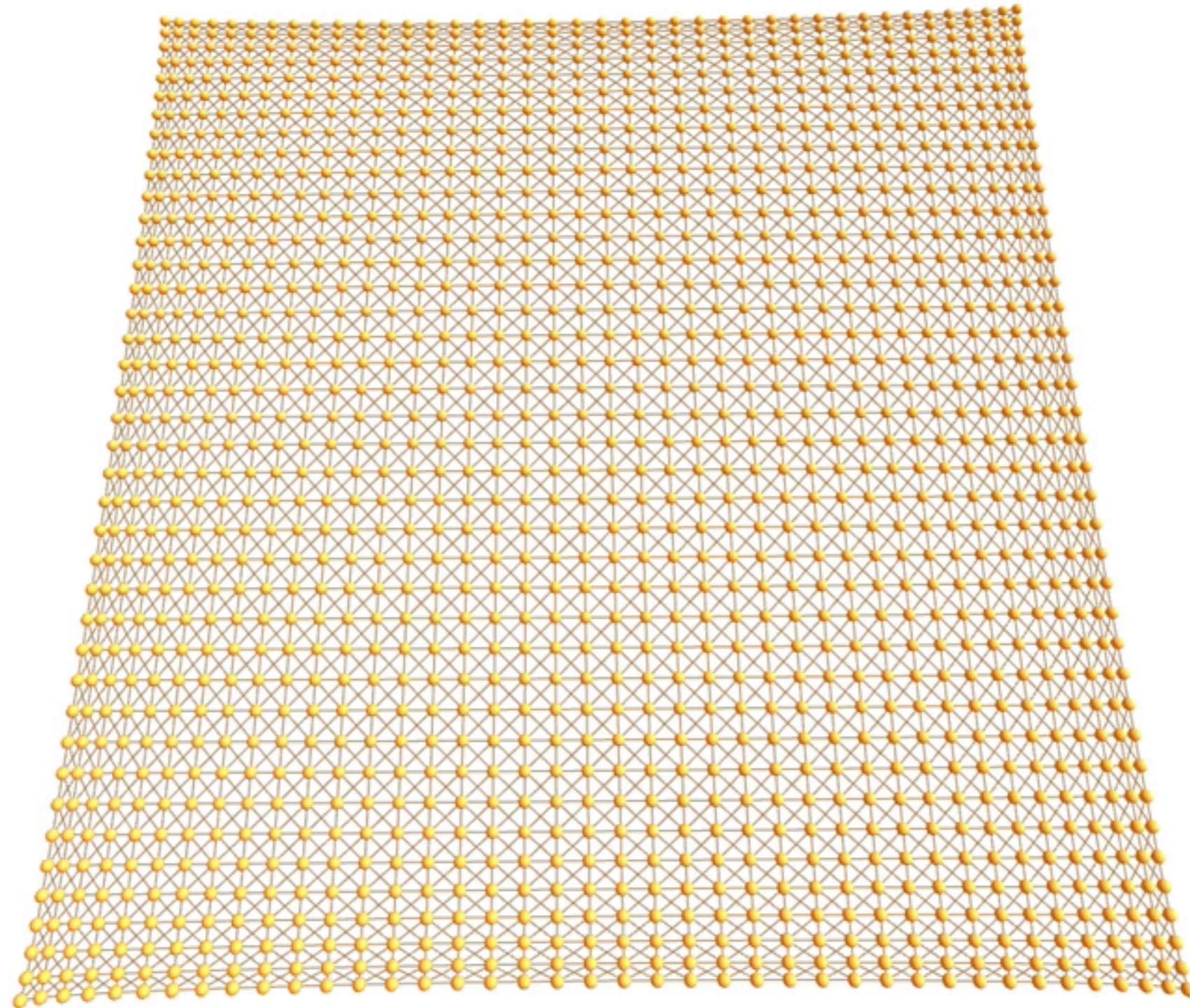
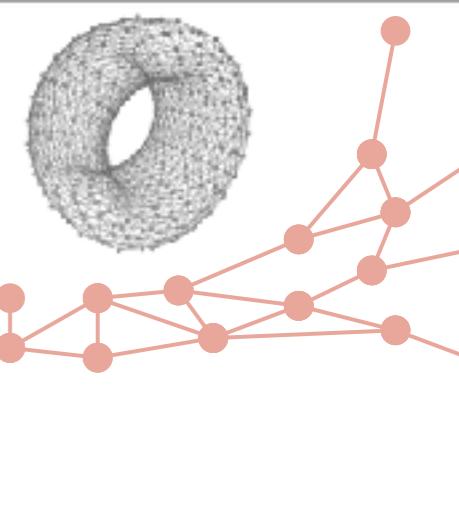


Watts-Strogatz 1D

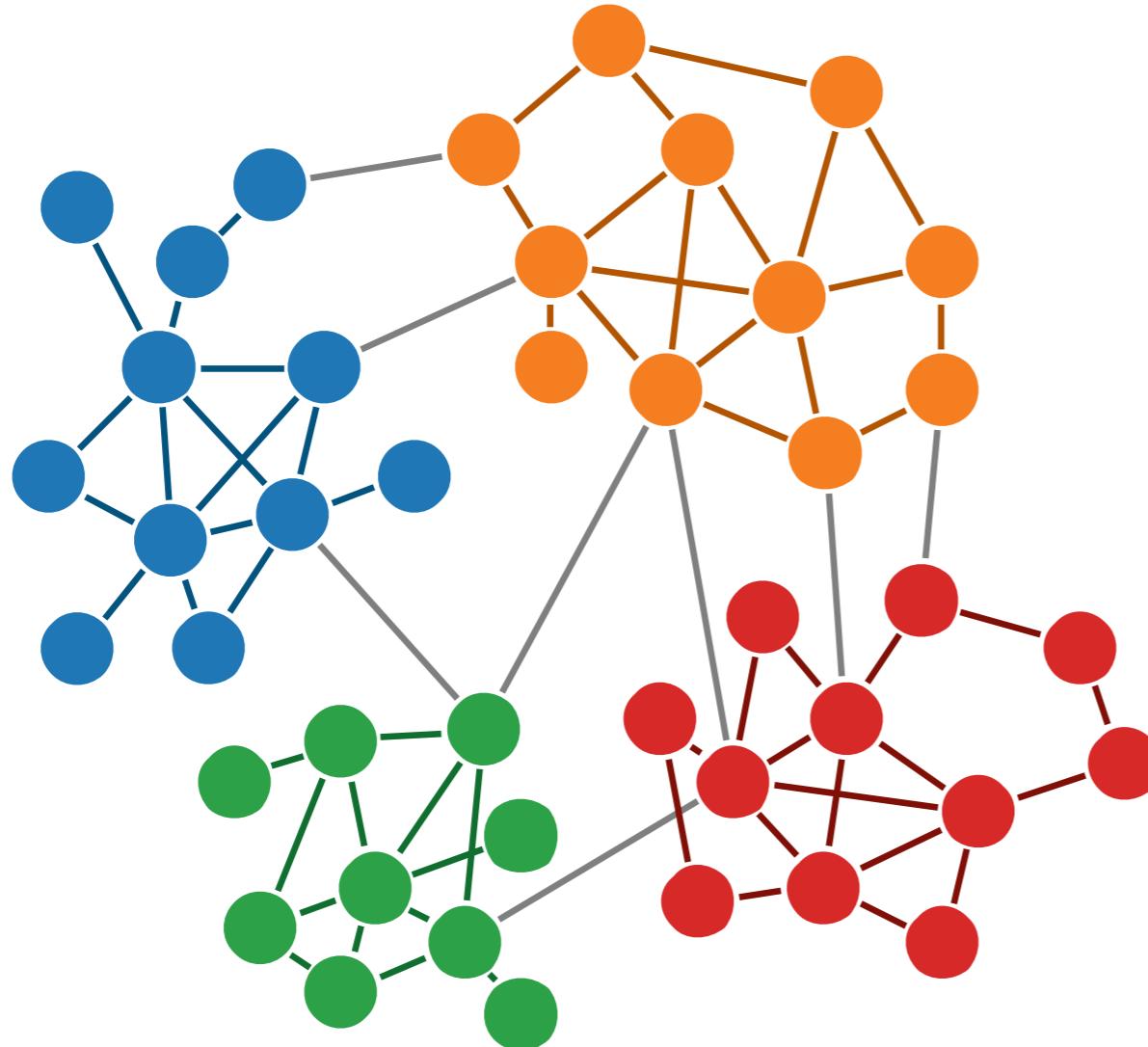
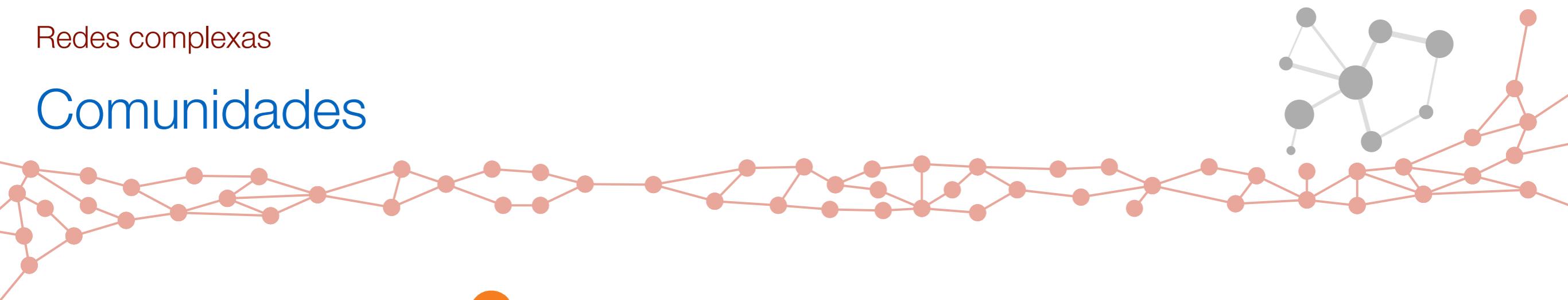


Watts-Strogatz 1D

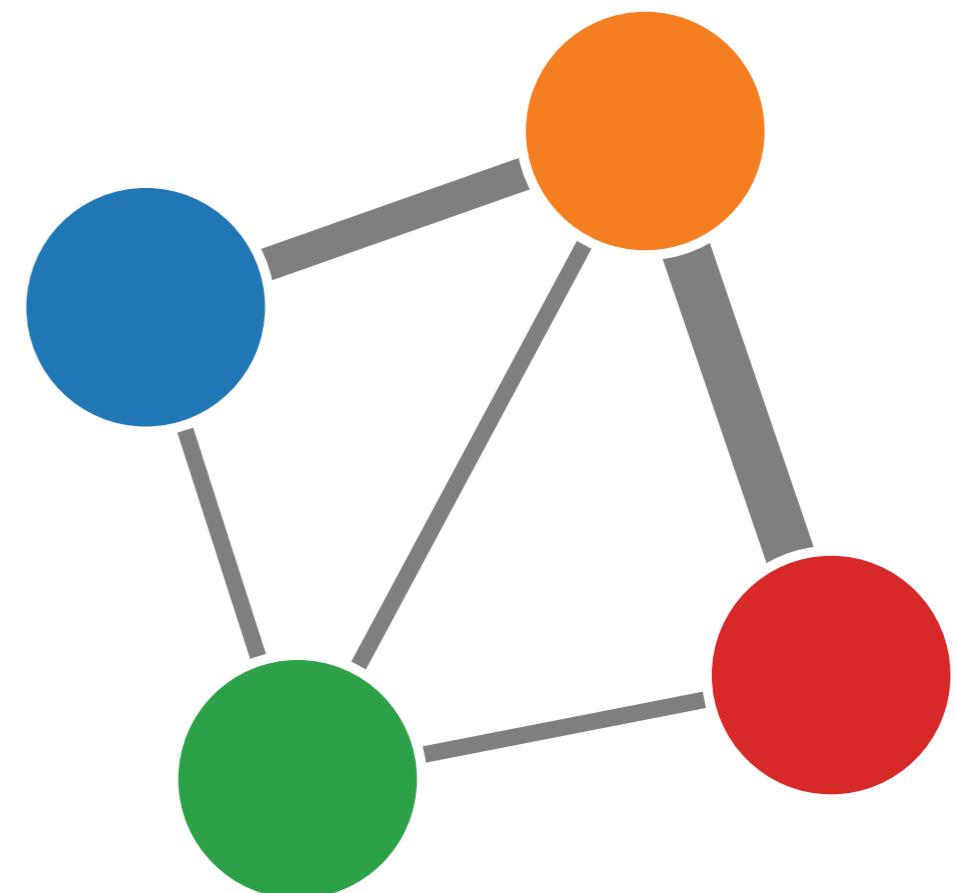
## Modelo pequeno mundo Watts-Strogatz



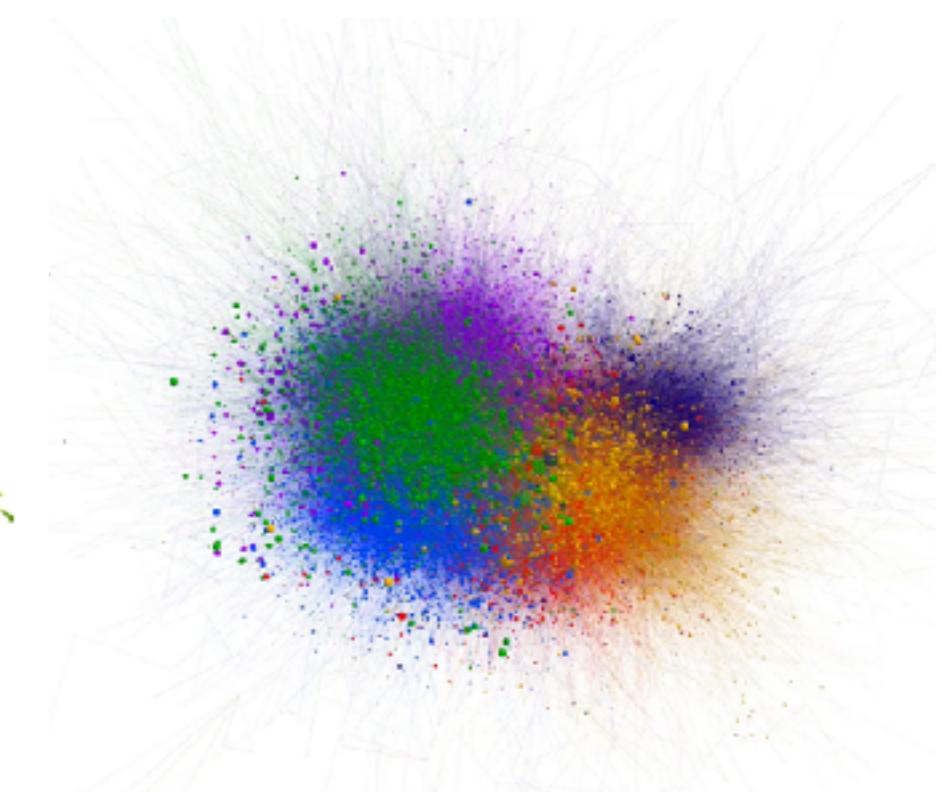
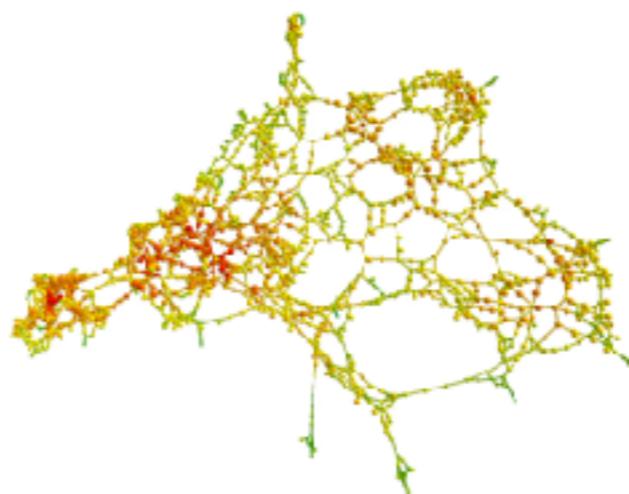
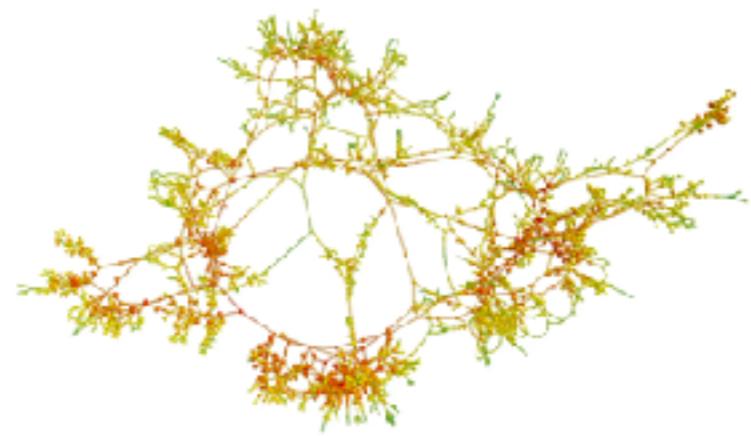
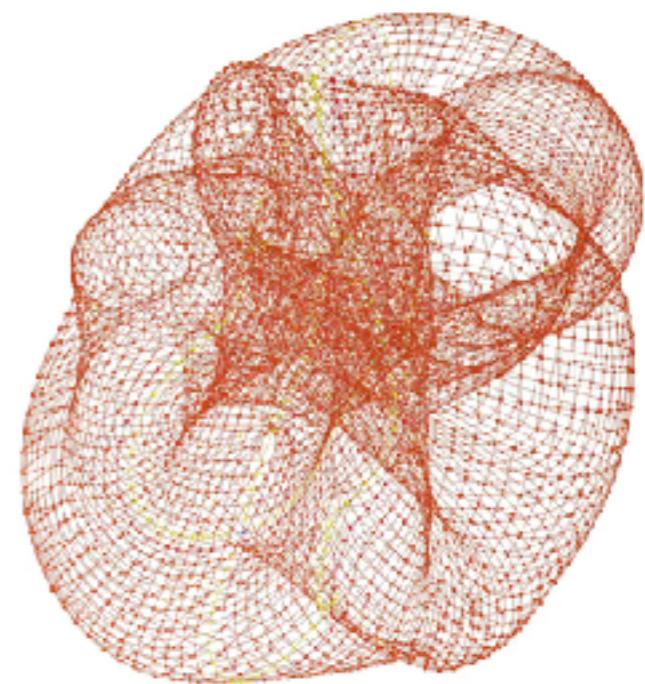
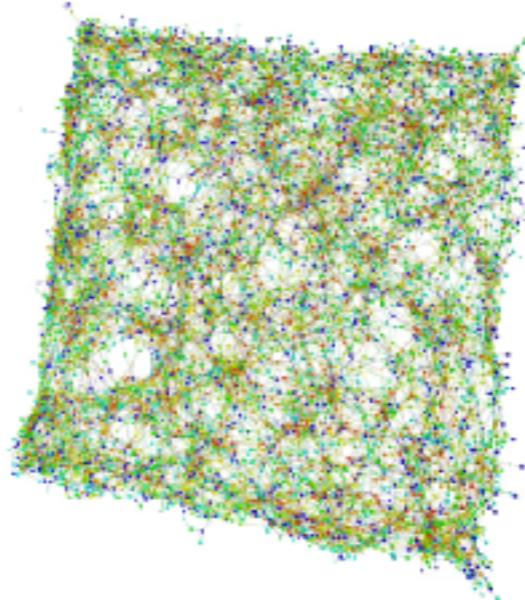
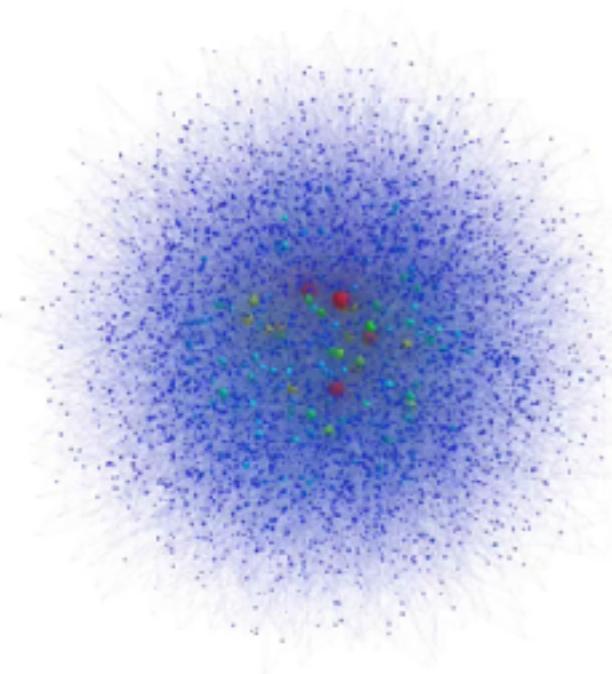
## Comunidades



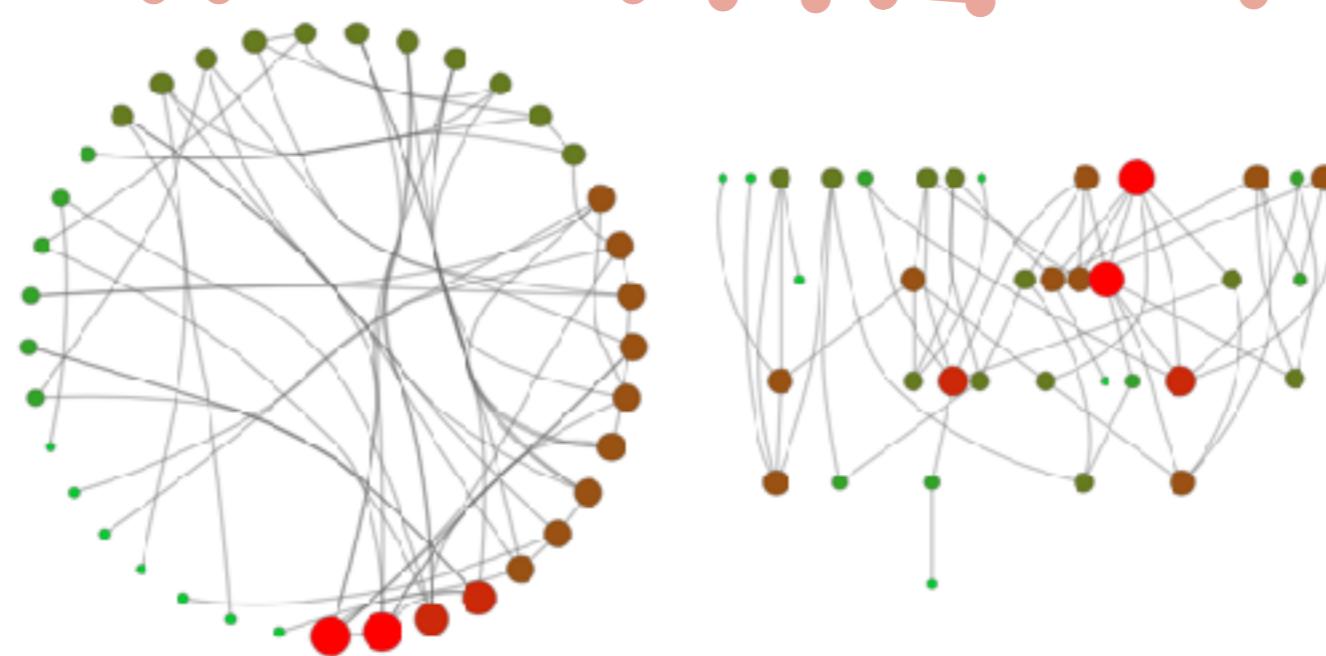
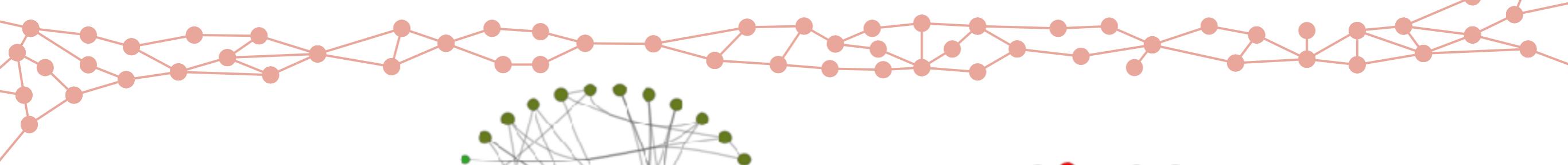
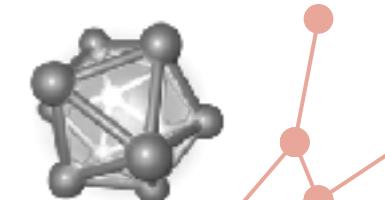
(a) Estrutura de comunidades



(b) Grafo reduzido de comunidades

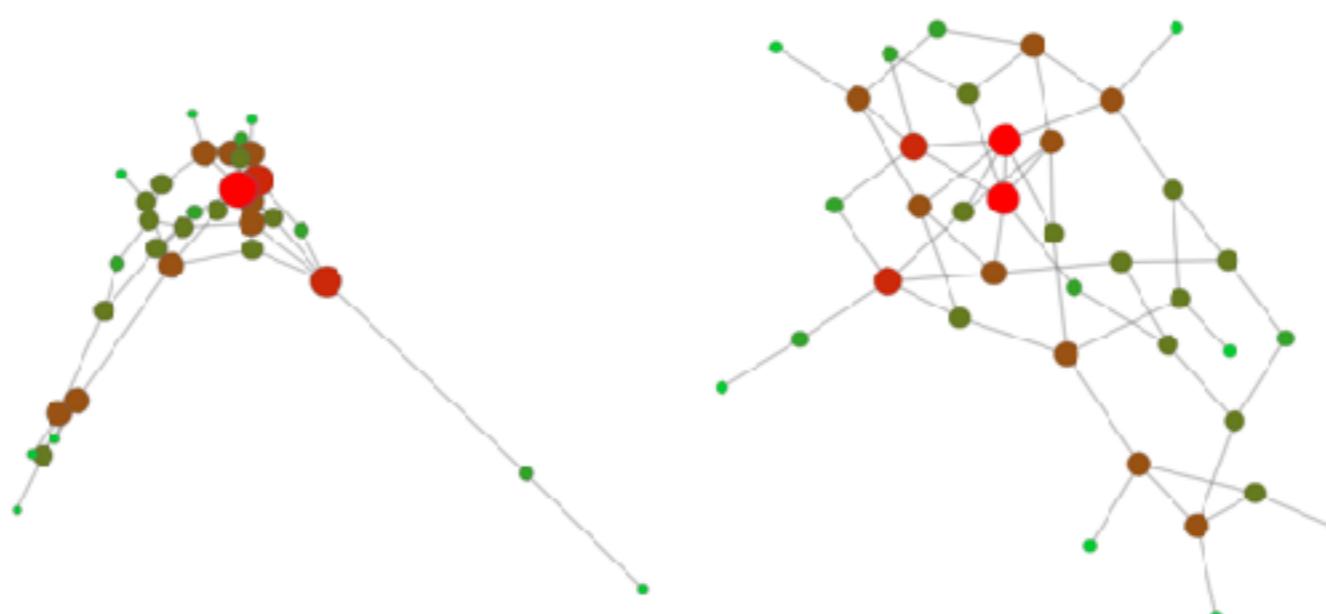


# Visualização de redes



(a) Circular layout

(b) Hierarchical layout



(c) Spectral layout

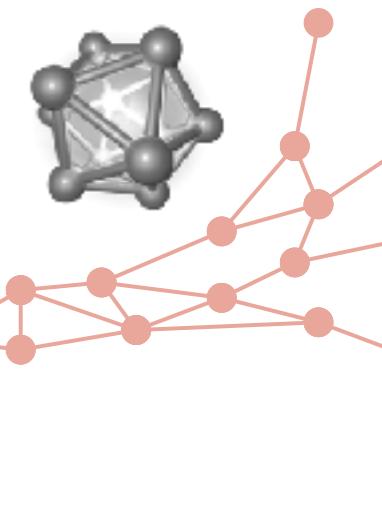
(d) Force-directed layout

Complex systems: features, similarity and connectivity

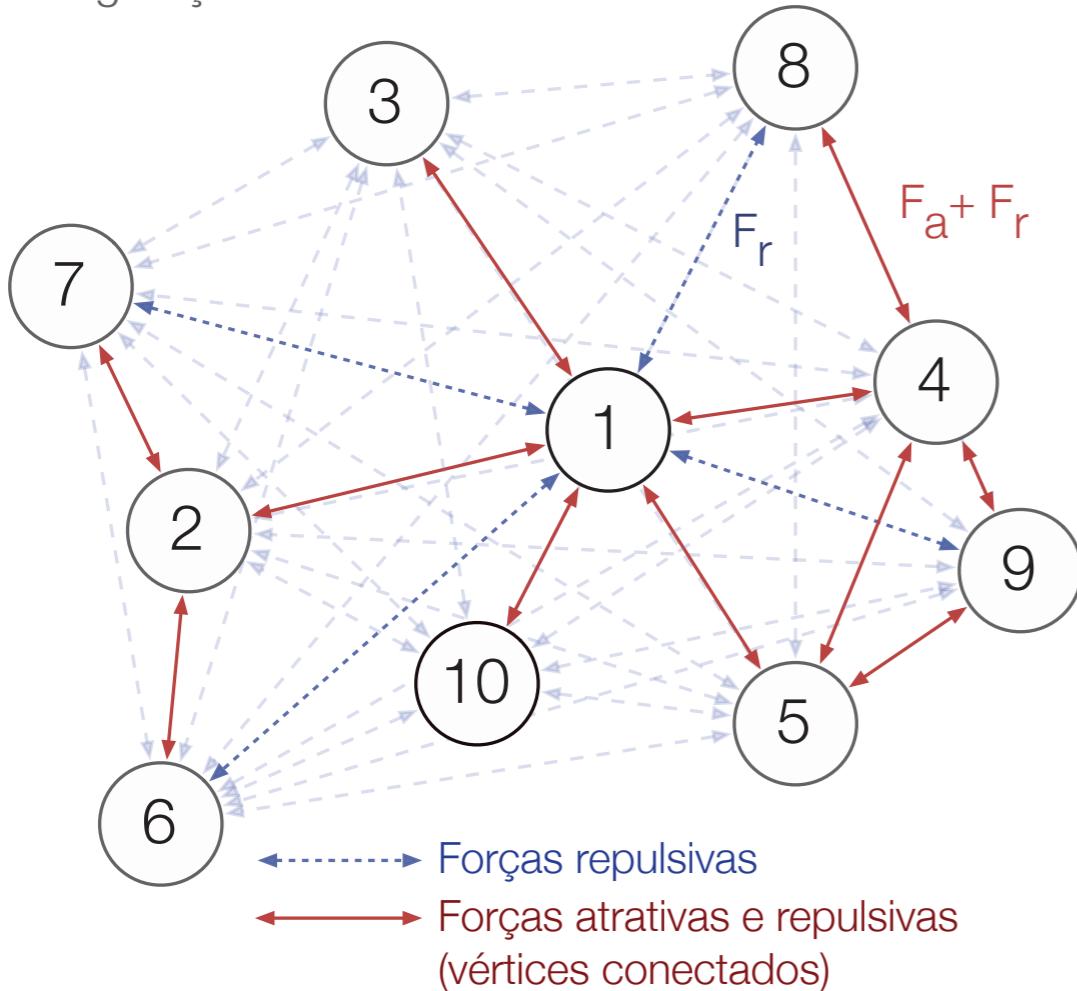
C. H. Comin, T. K. DM. Peron, F. N. Silva, D. R. Amancio, F. A. Rodrigues, L. da F. Costa

<https://arxiv.org/abs/1606.05400>

# Visualização de redes

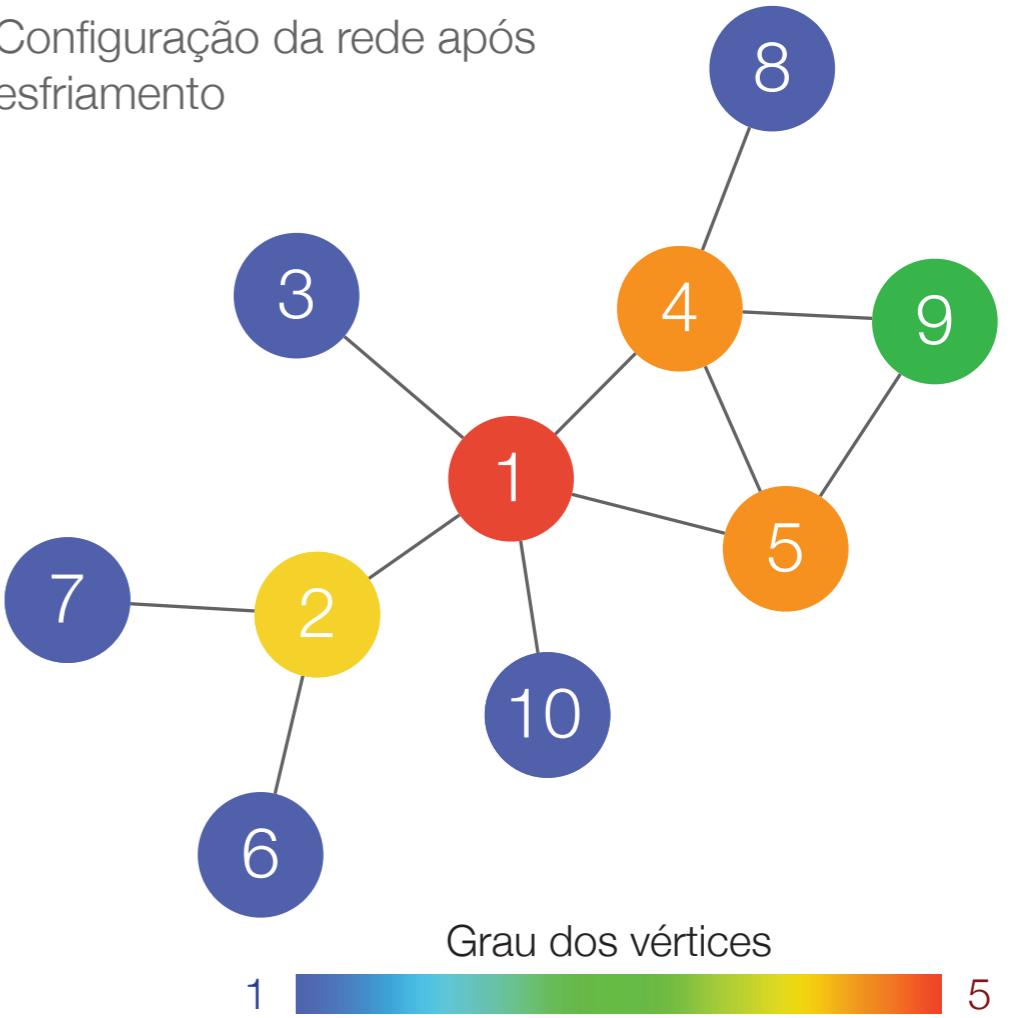


Configuração inicial aleatória



Simulação  
de dinâmica  
molecular

Configuração da rede após esfriamento



Visualizing Complex Networks (CDT-5)

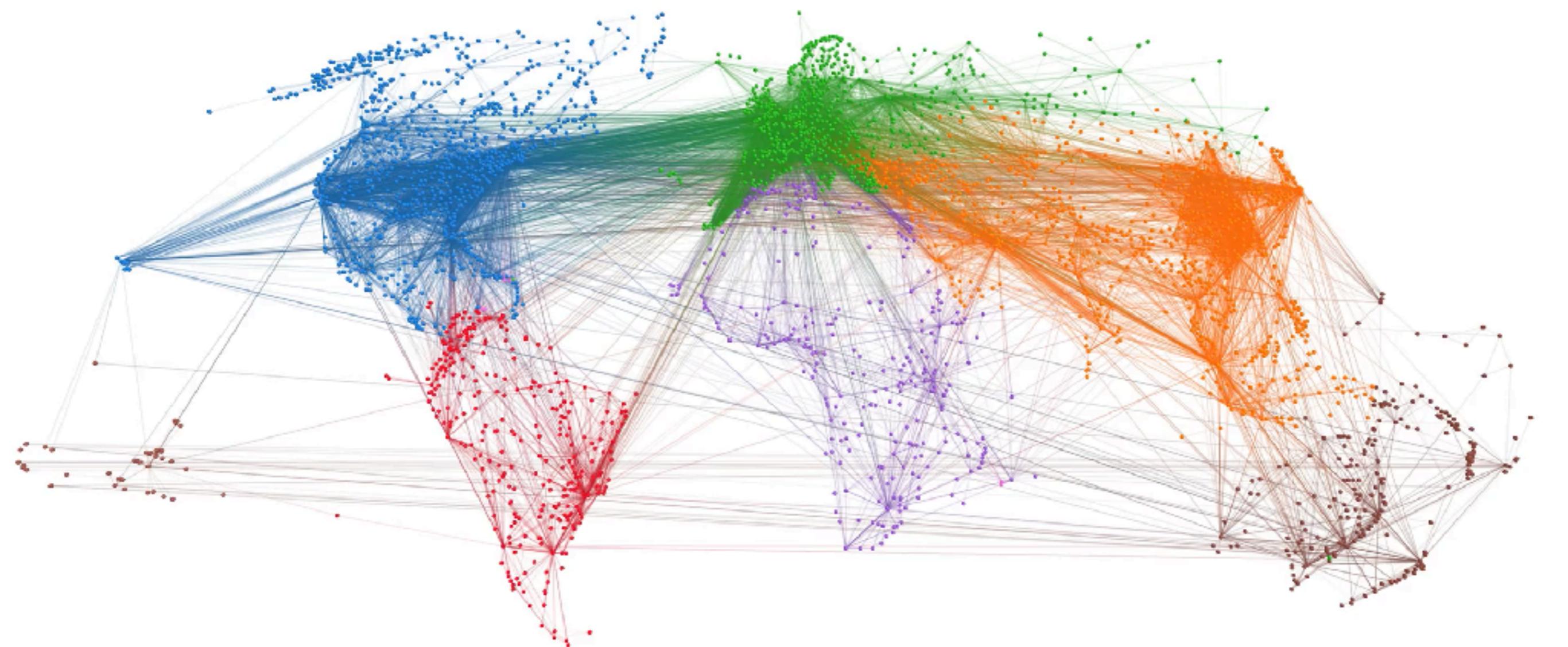
Silva, F. N. and Costa, L. da F.

<http://dx.doi.org/10.13140/RG.2.2.21310.74567/1>

# Exemplos de redes complexas



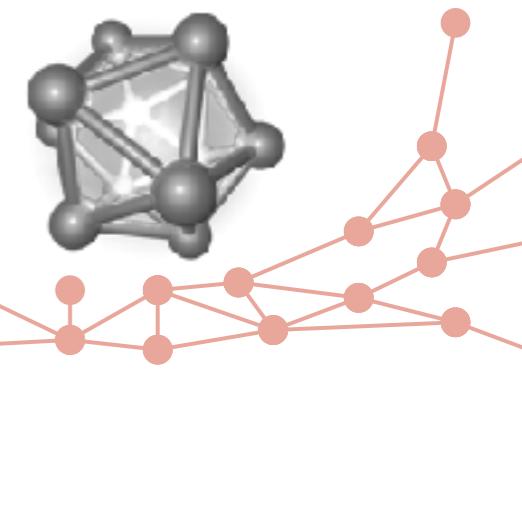
Rede de aeroportos



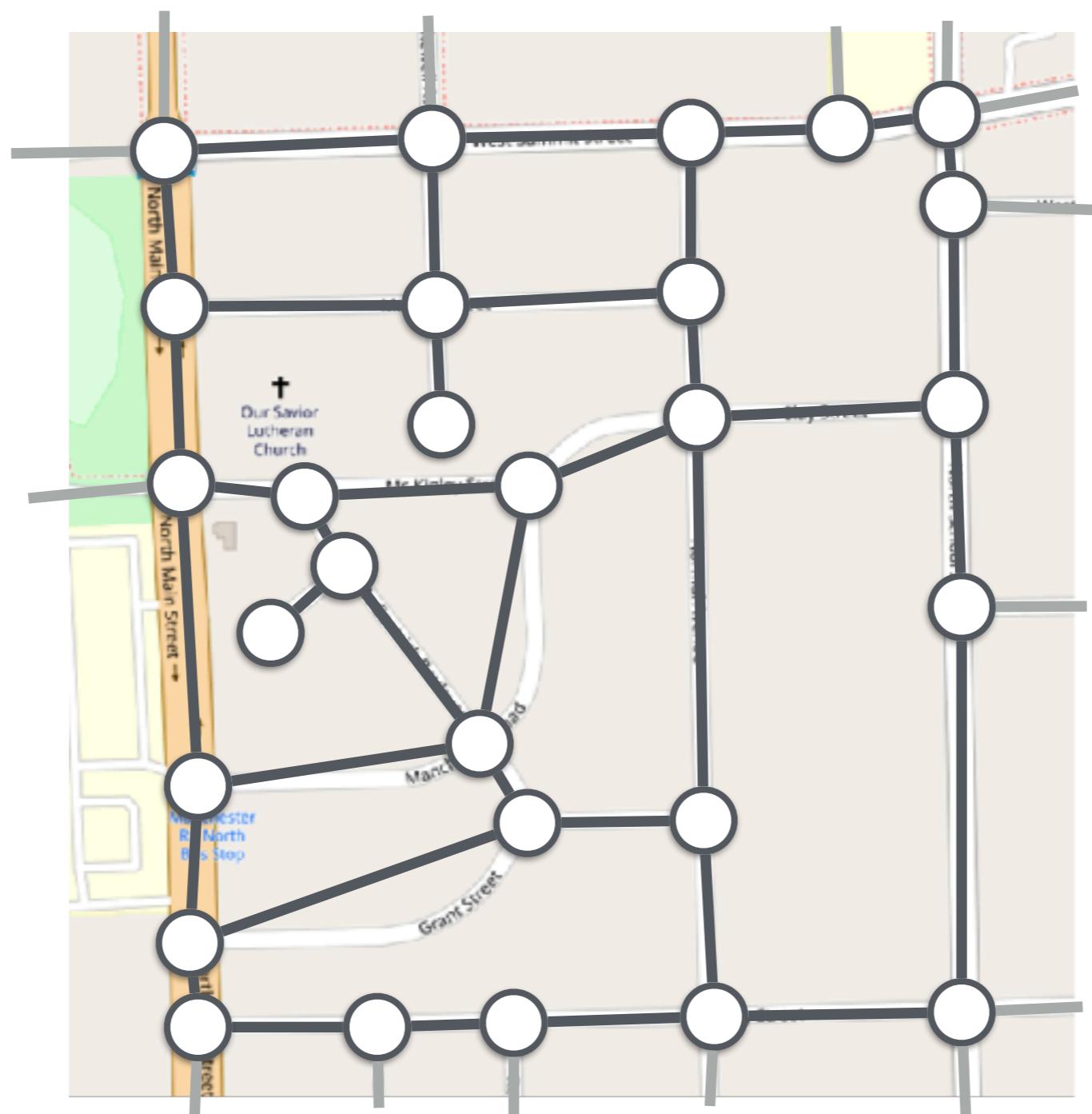
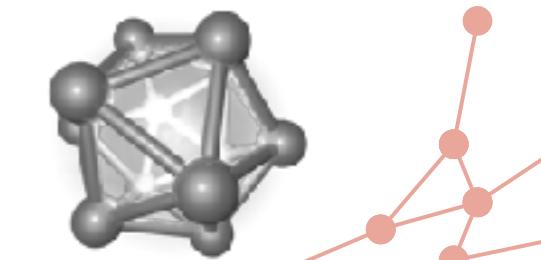
Visualizing Complex Networks (CDT-5)  
Silva, F. N. and Costa, L. da F.

<http://dx.doi.org/10.13140/RG.2.2.21310.74567/1>

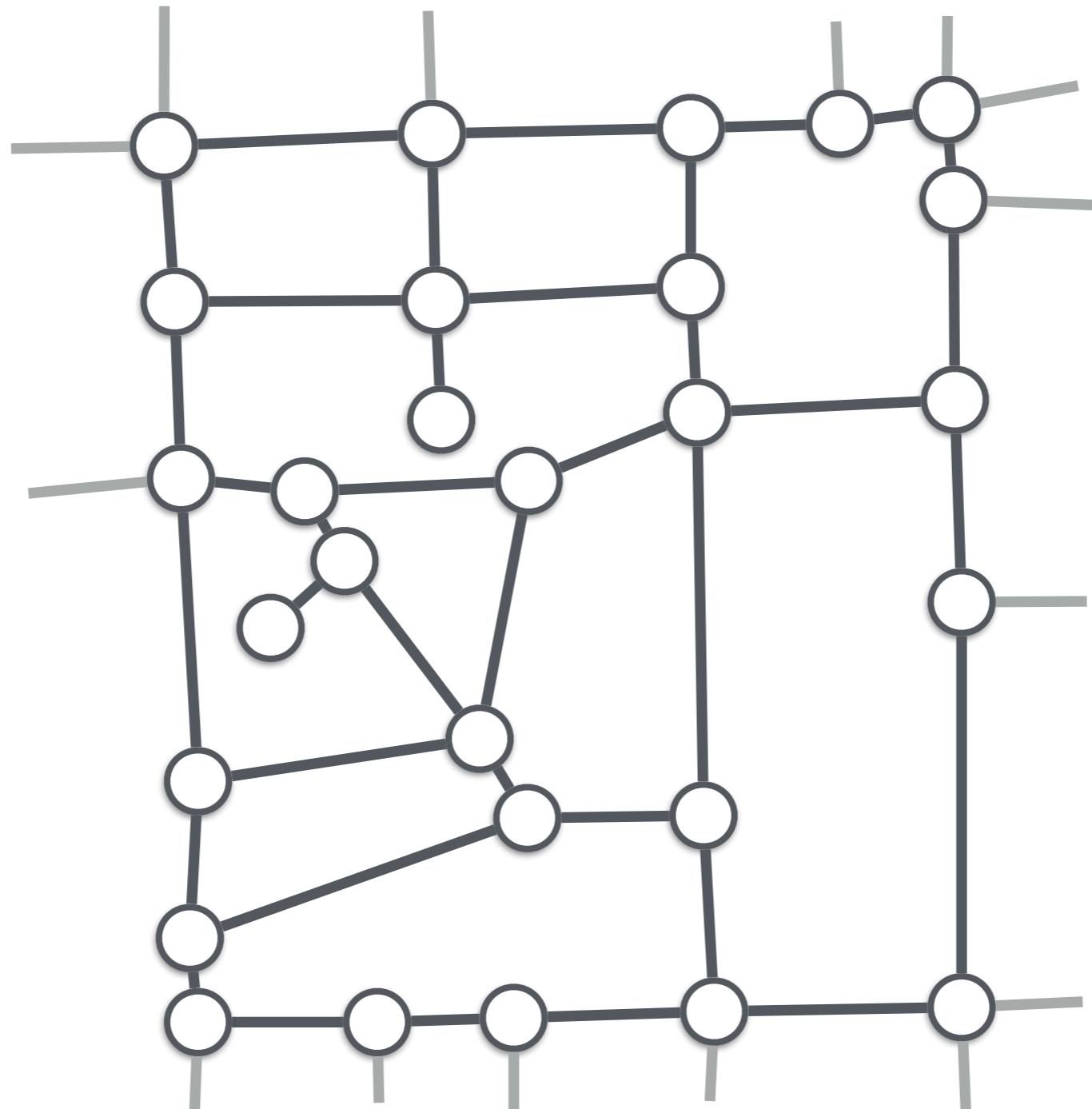
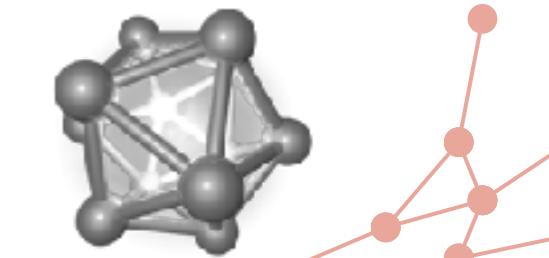
# Redes urbanas



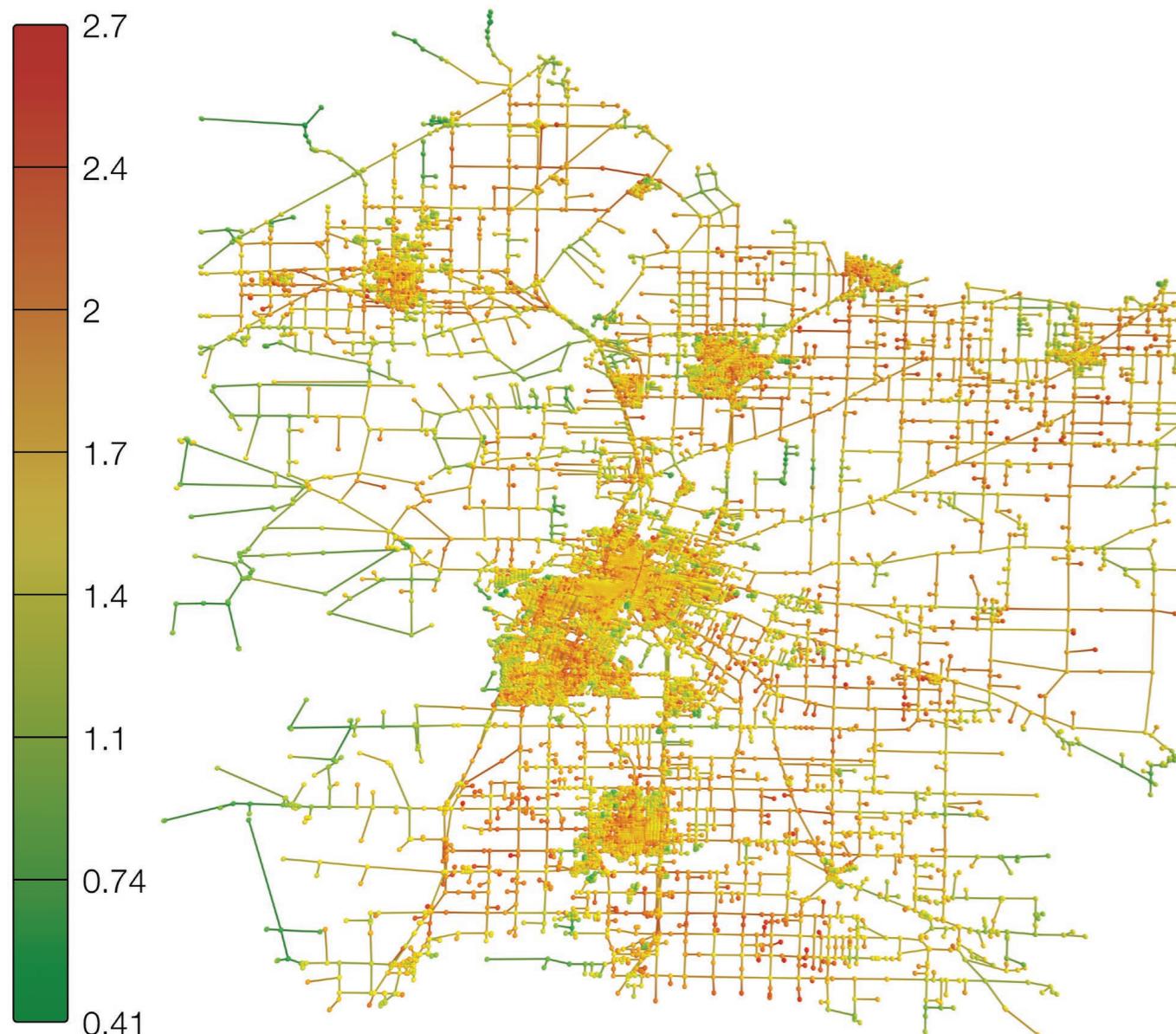
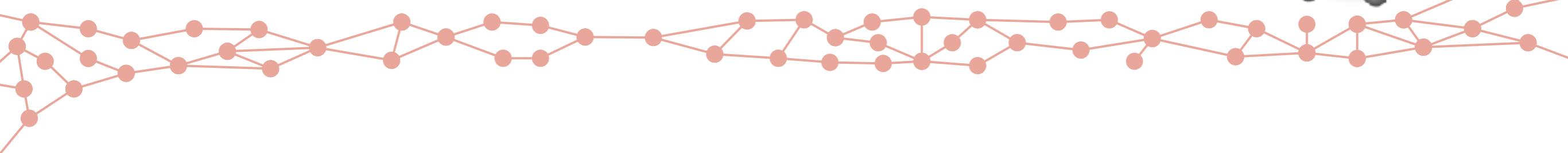
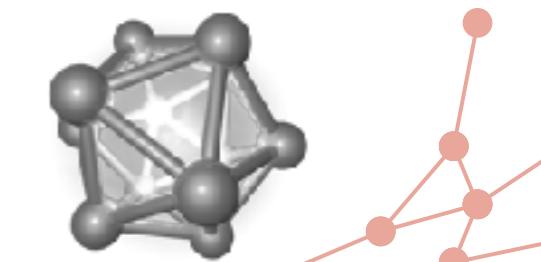
## Redes urbanas



## Redes urbanas



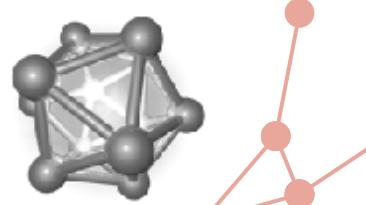
## Redes urbanas



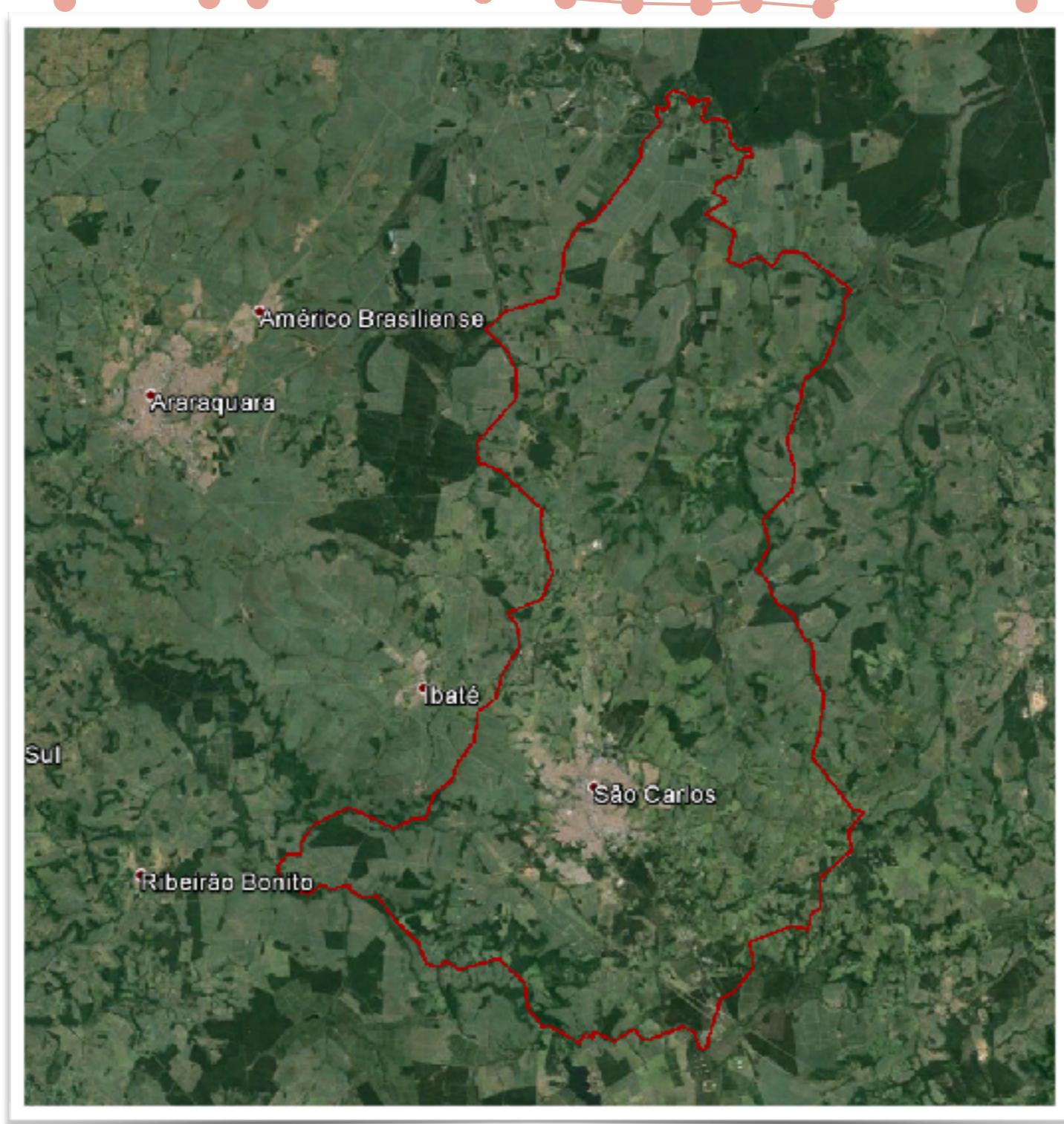
(a) San Joaquin



(b) Oldenburg

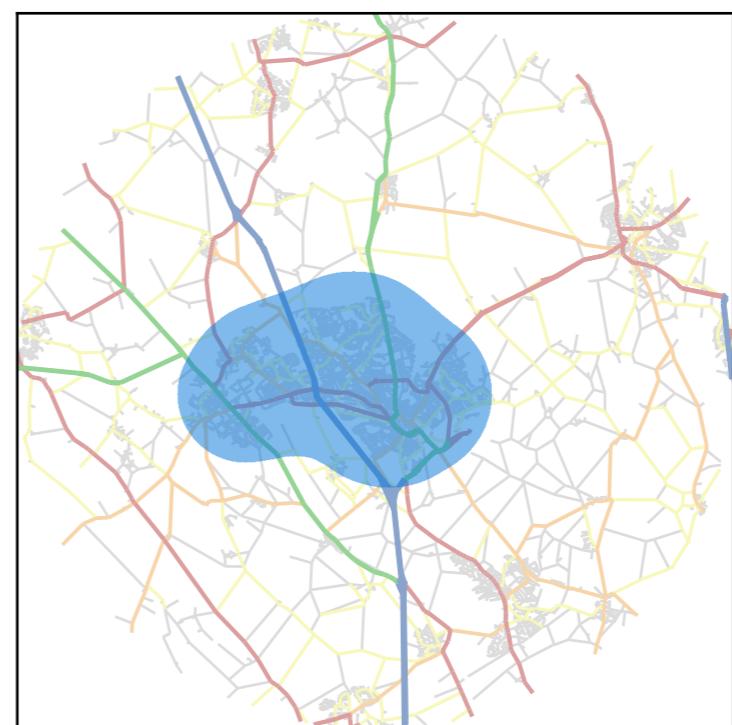
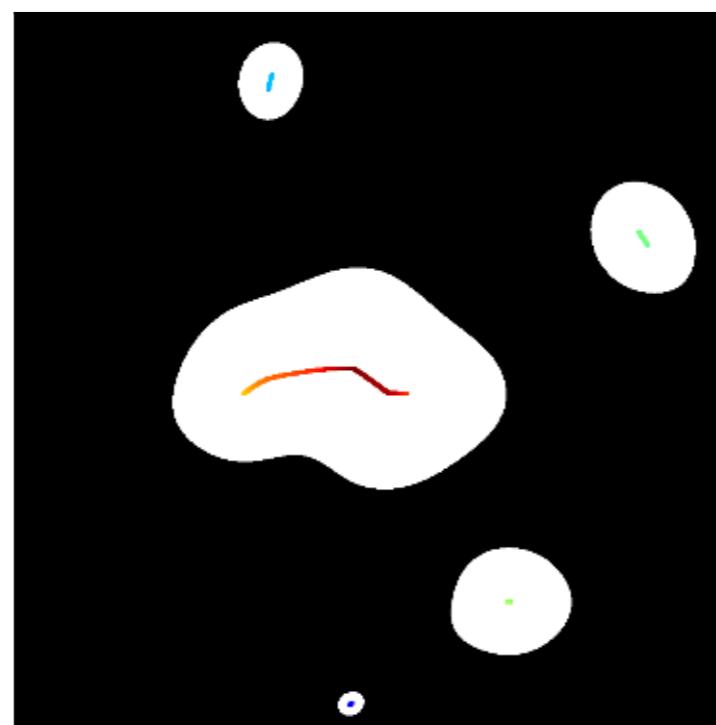
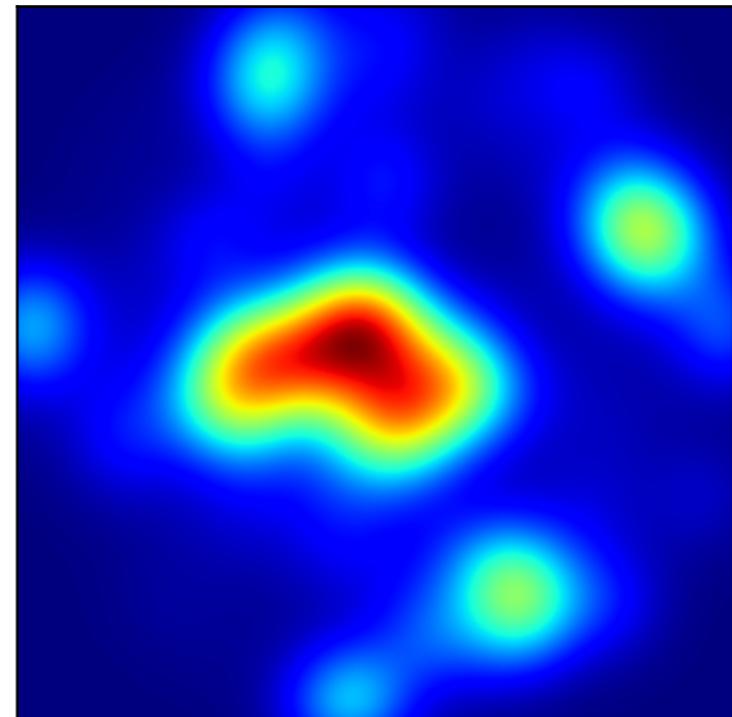
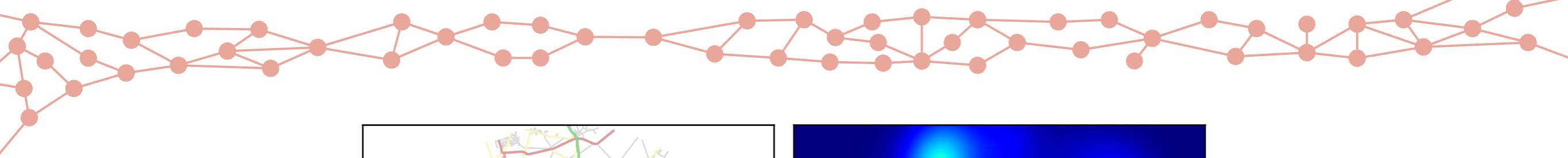
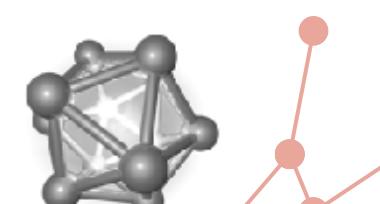


# Detecção de bordas em cidades

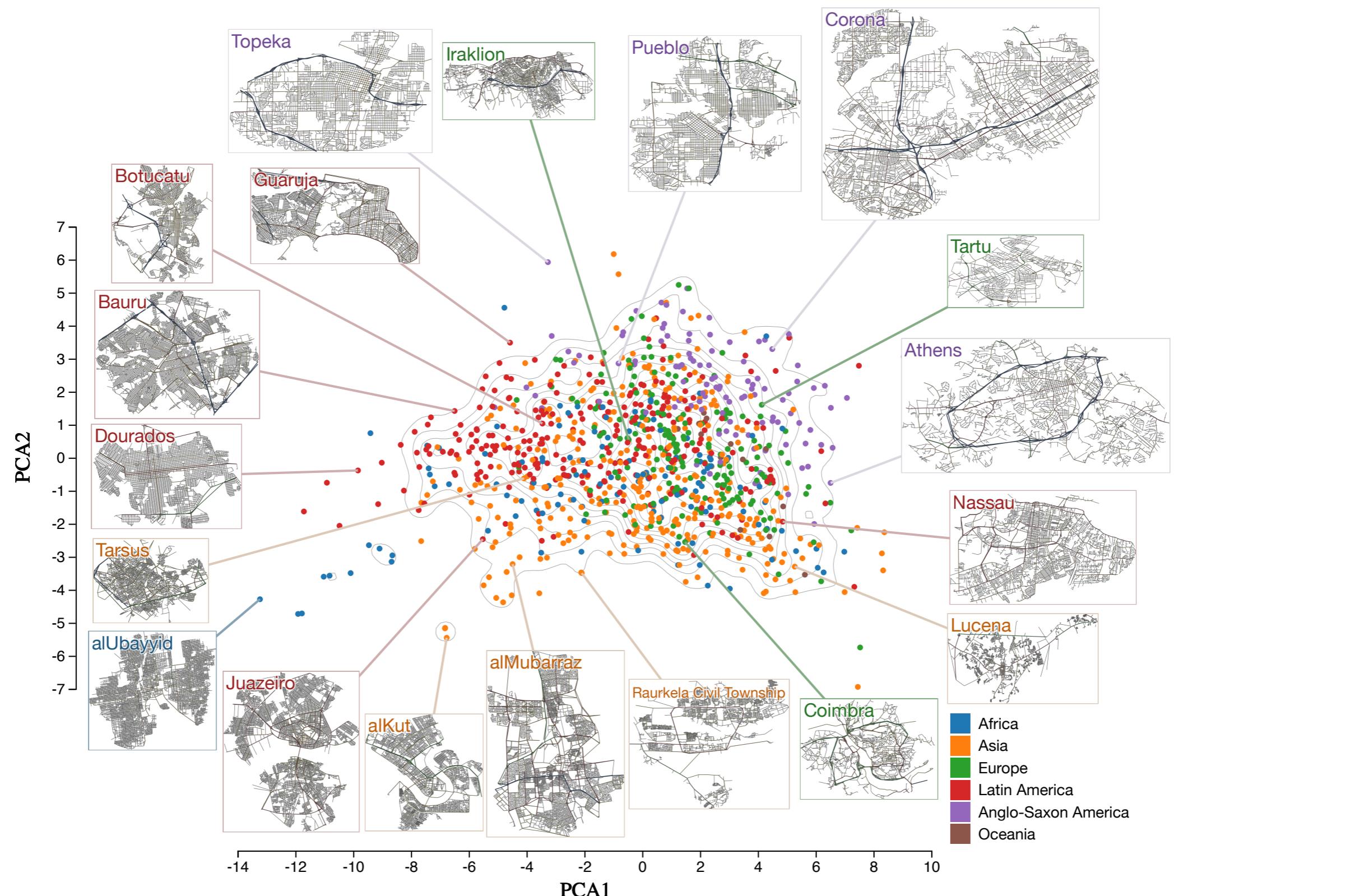
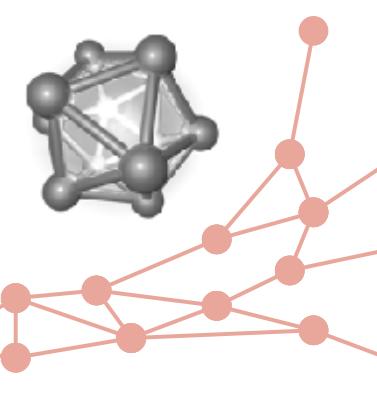


Área administrativa de São Carlos

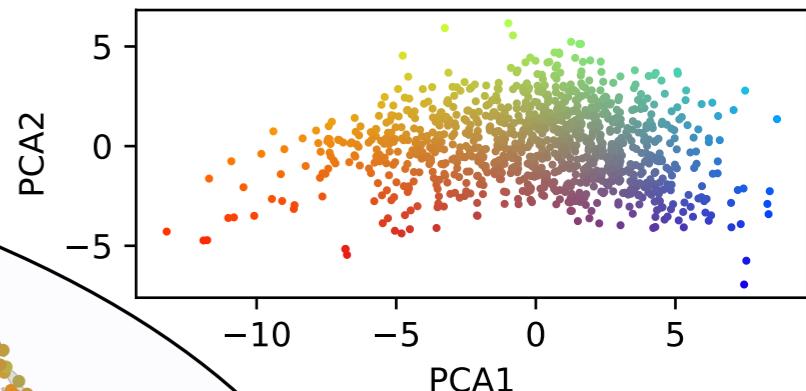
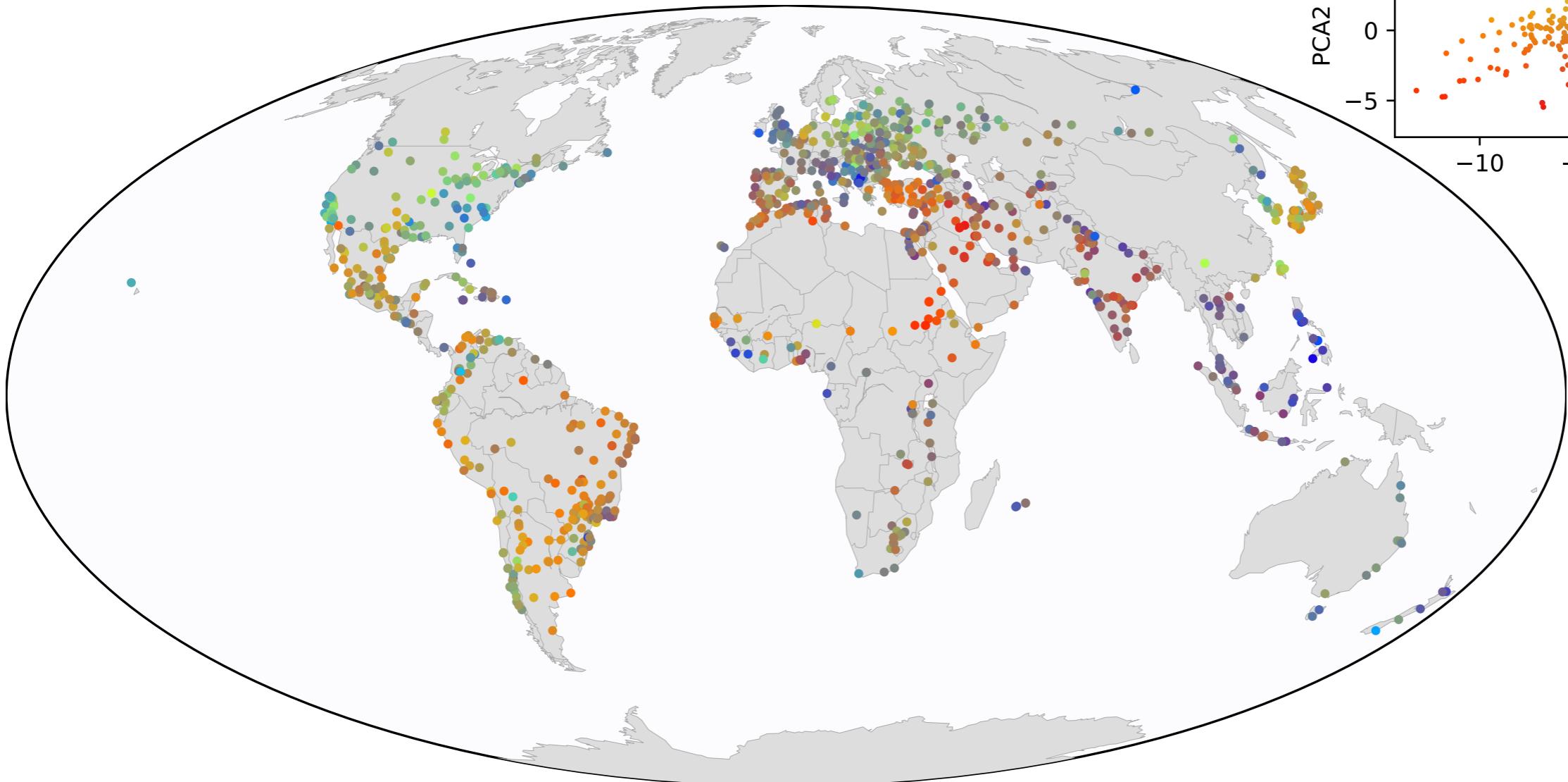
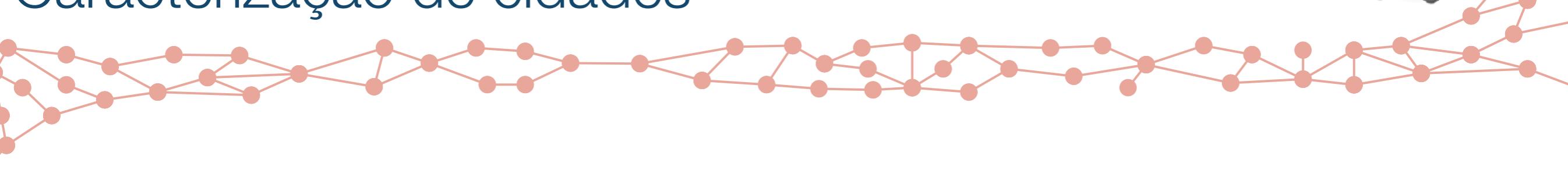
## Detecção de bordas em cidades



# Caracterização de cidades



# Caracterização de cidades



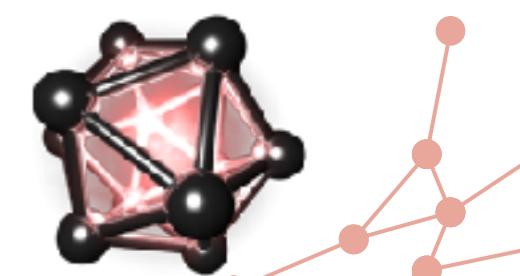
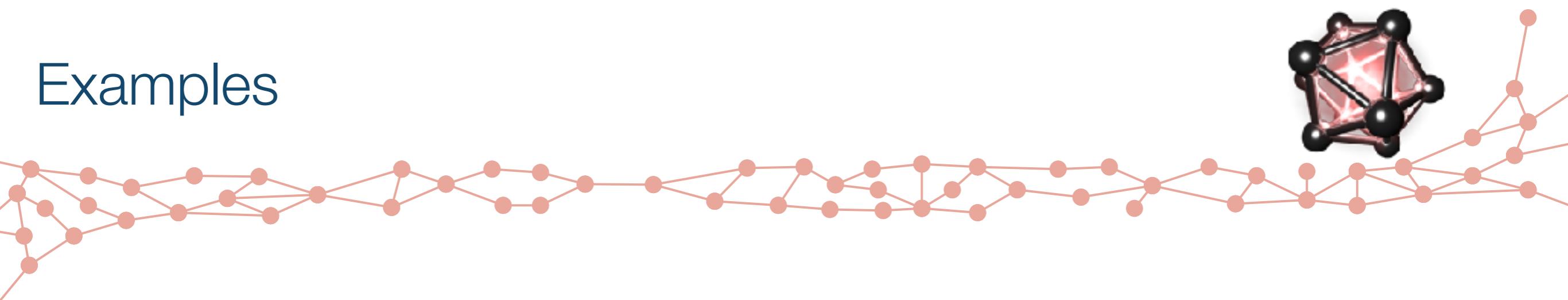
**Topological characterization of world cities**

G. S. Domingues, F. N. Silva, C. H. Comin, L. da F. Costa

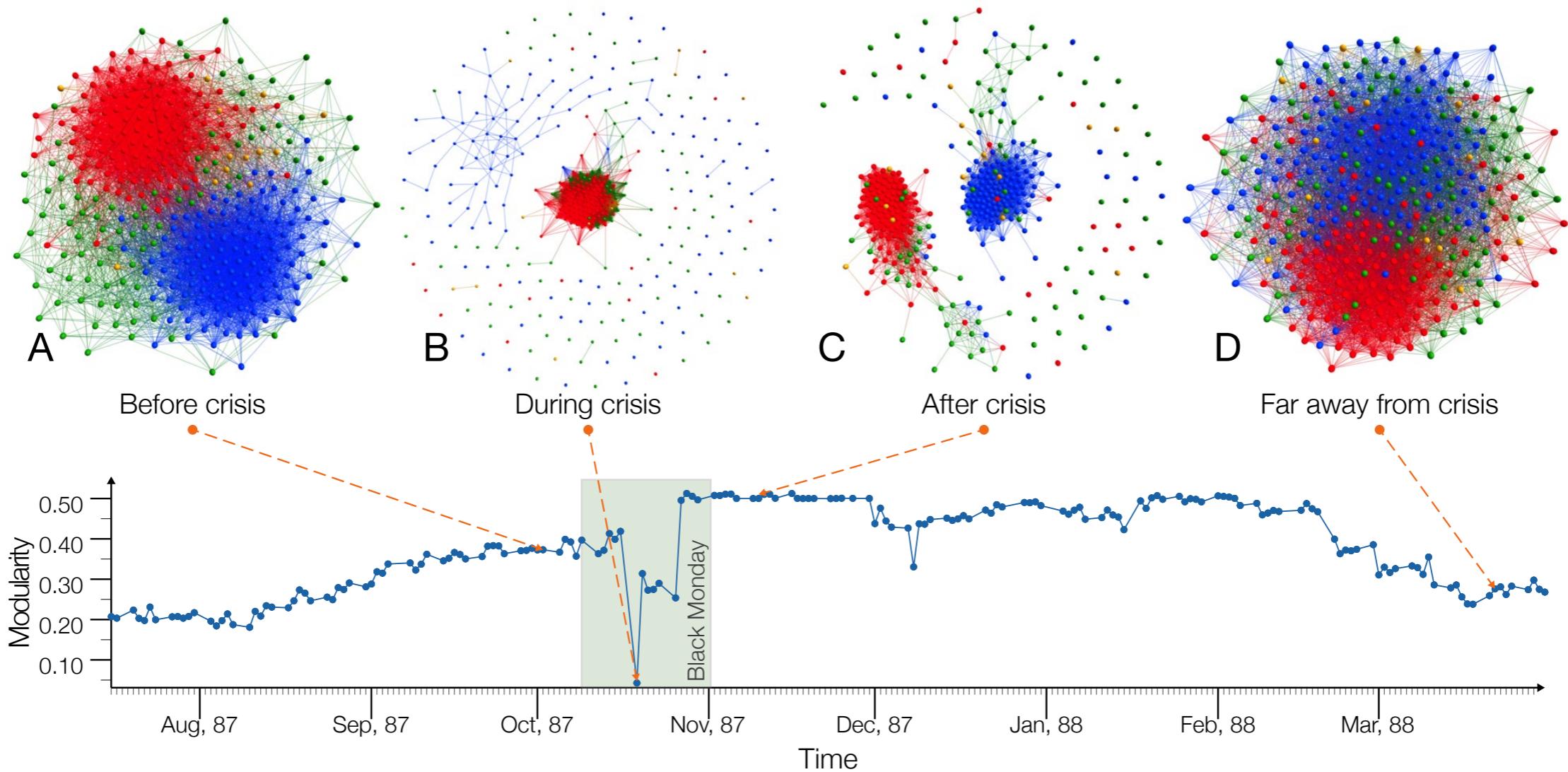
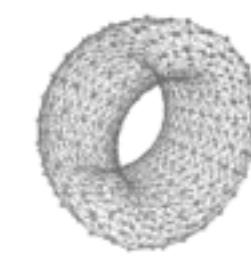
Journal of Statistical Mechanics: Theory and Experiment, v. 2018, n. 8, p. 083212, 2018

<https://arxiv.org/abs/1709.08244>

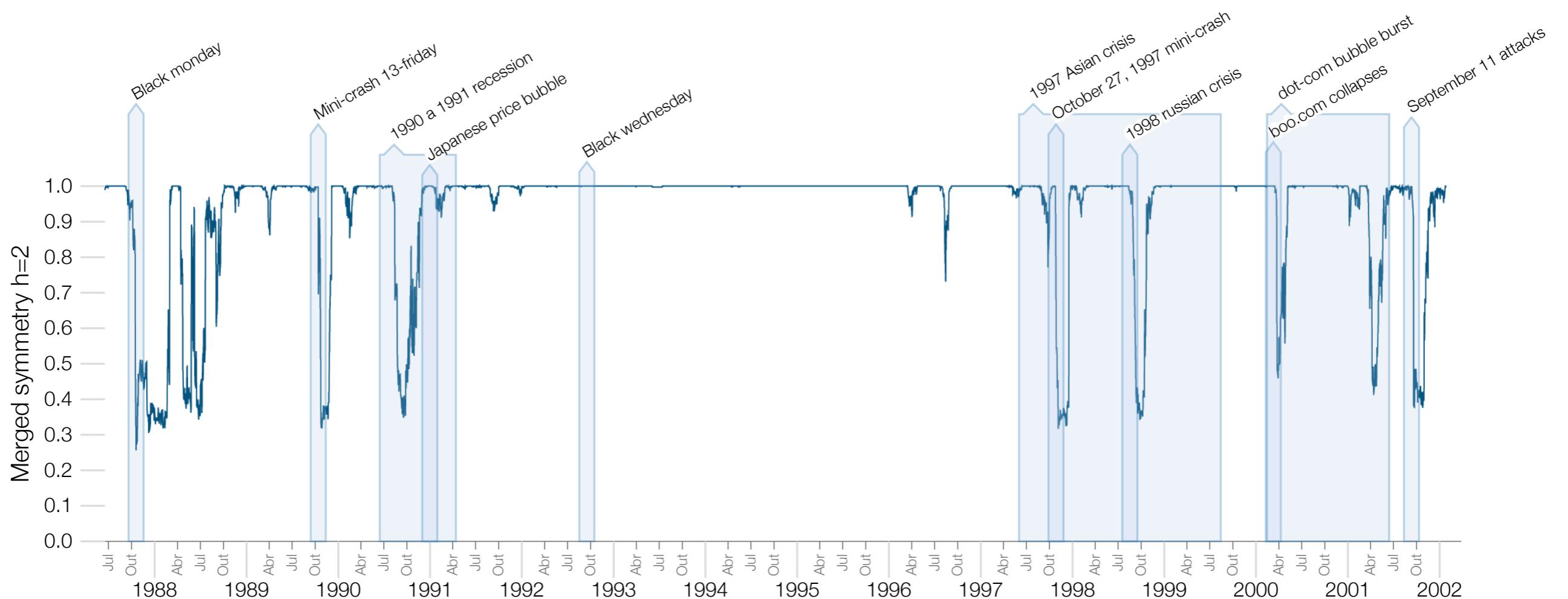
## Examples



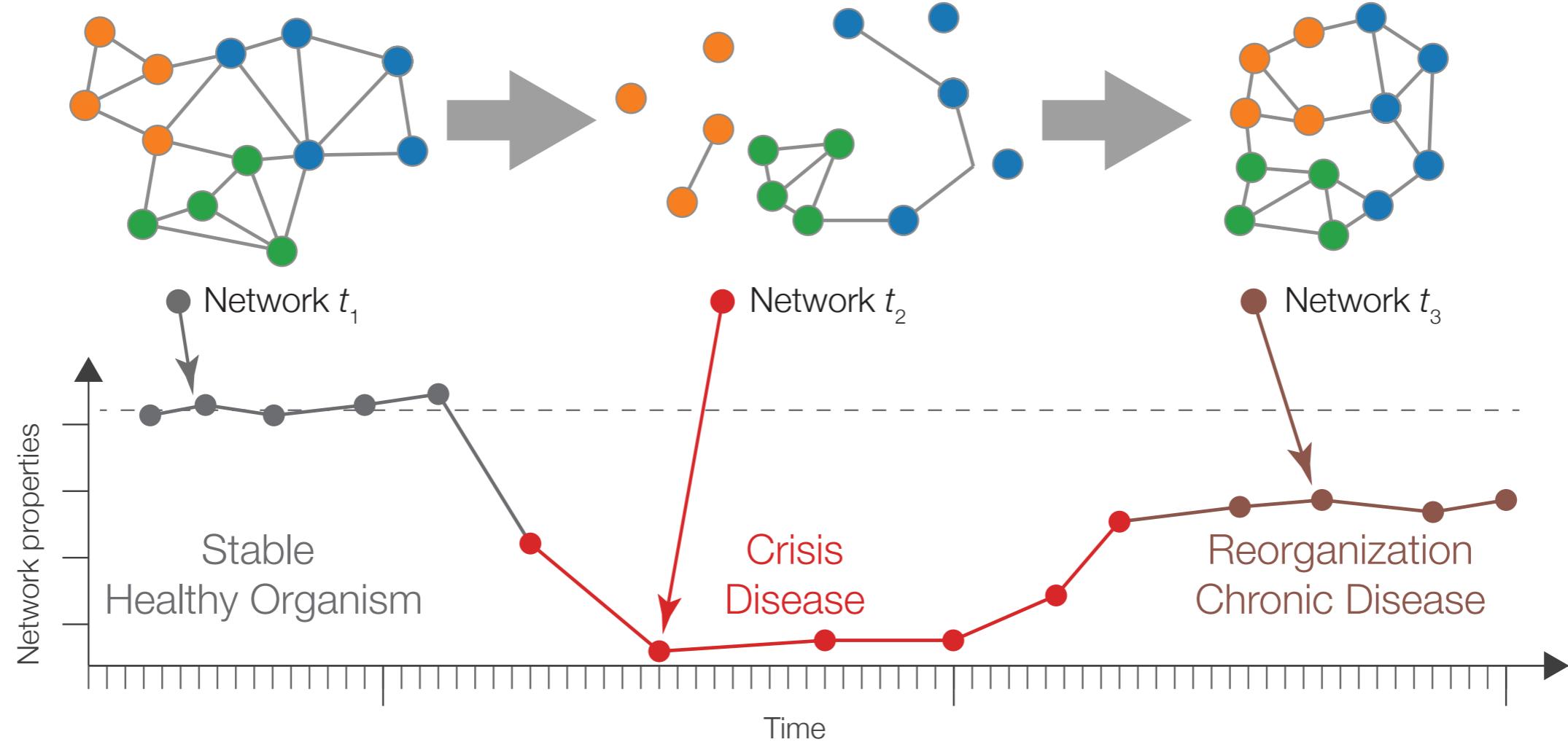
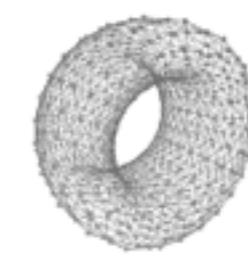
# Financial market networks



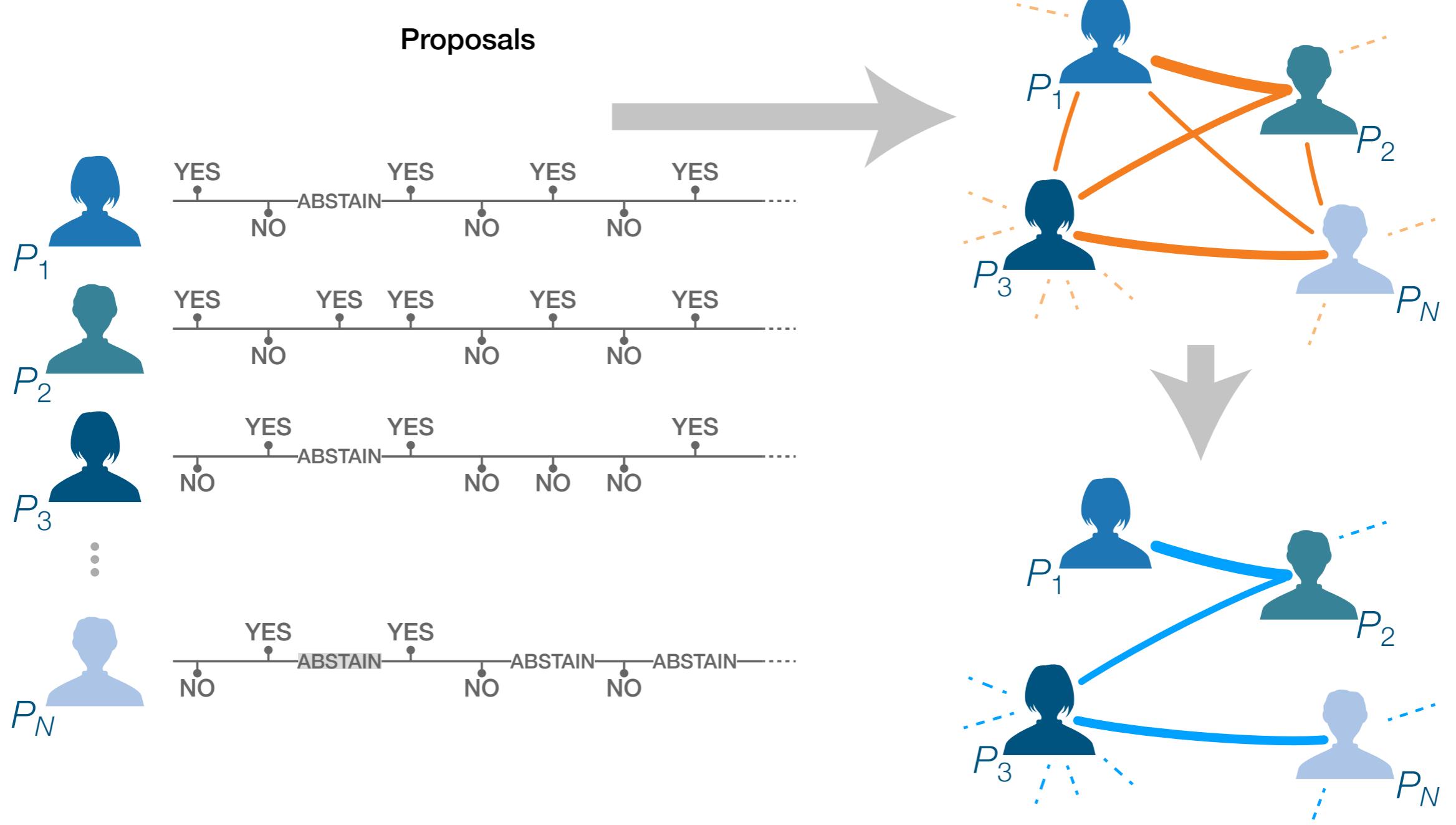
# Symmetry applied to the financial market network



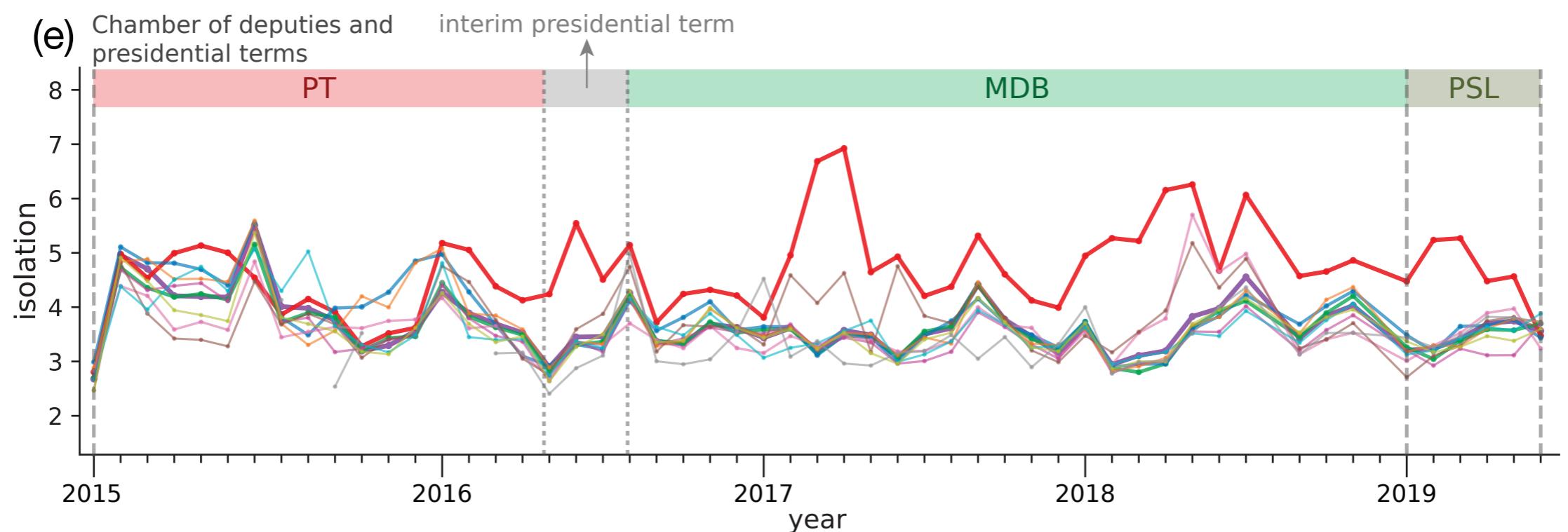
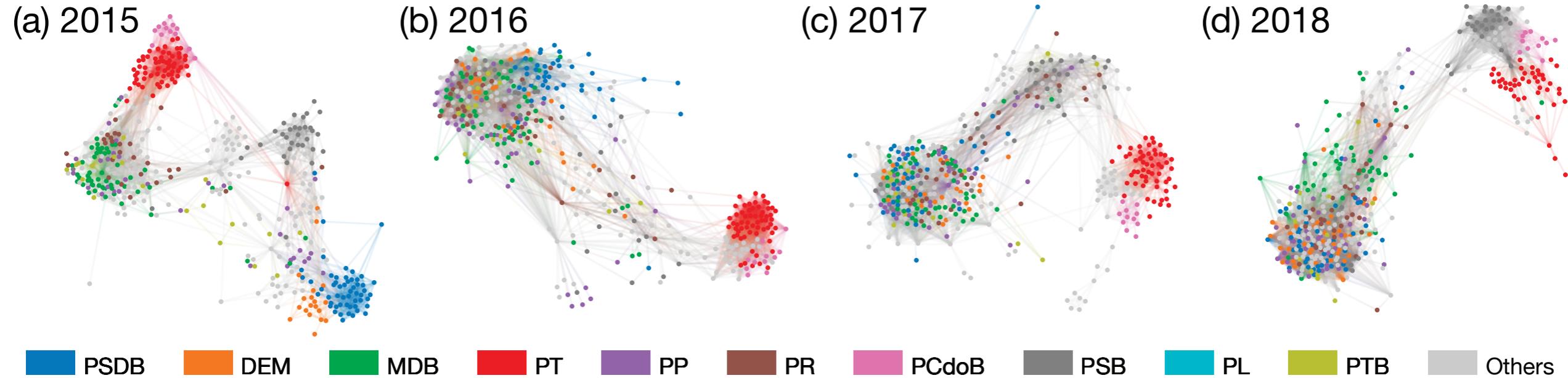
# Time evolving network during crisis



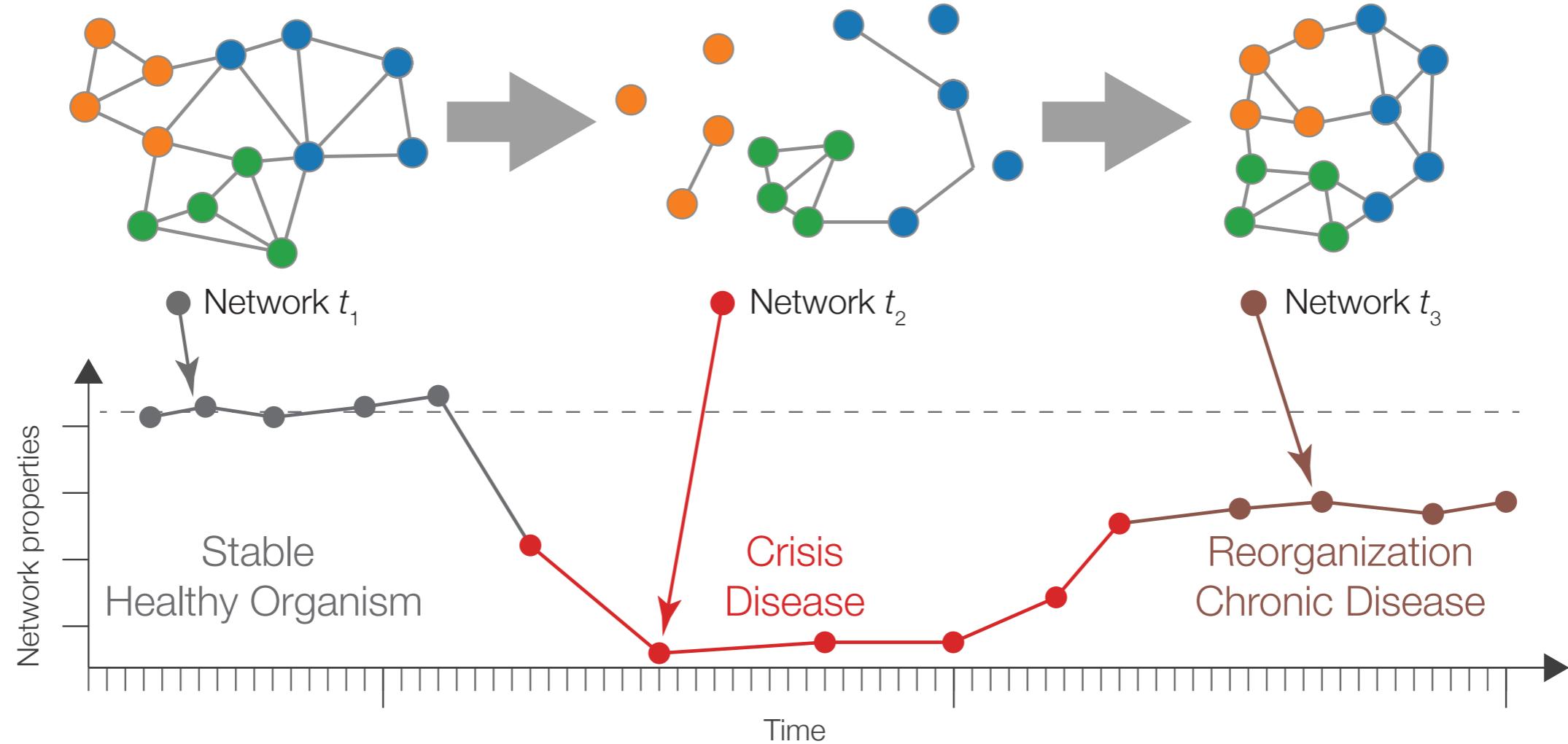
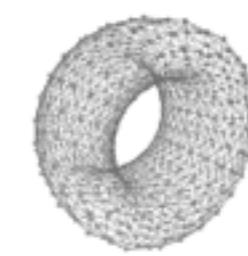
# Political networks



# Political networks

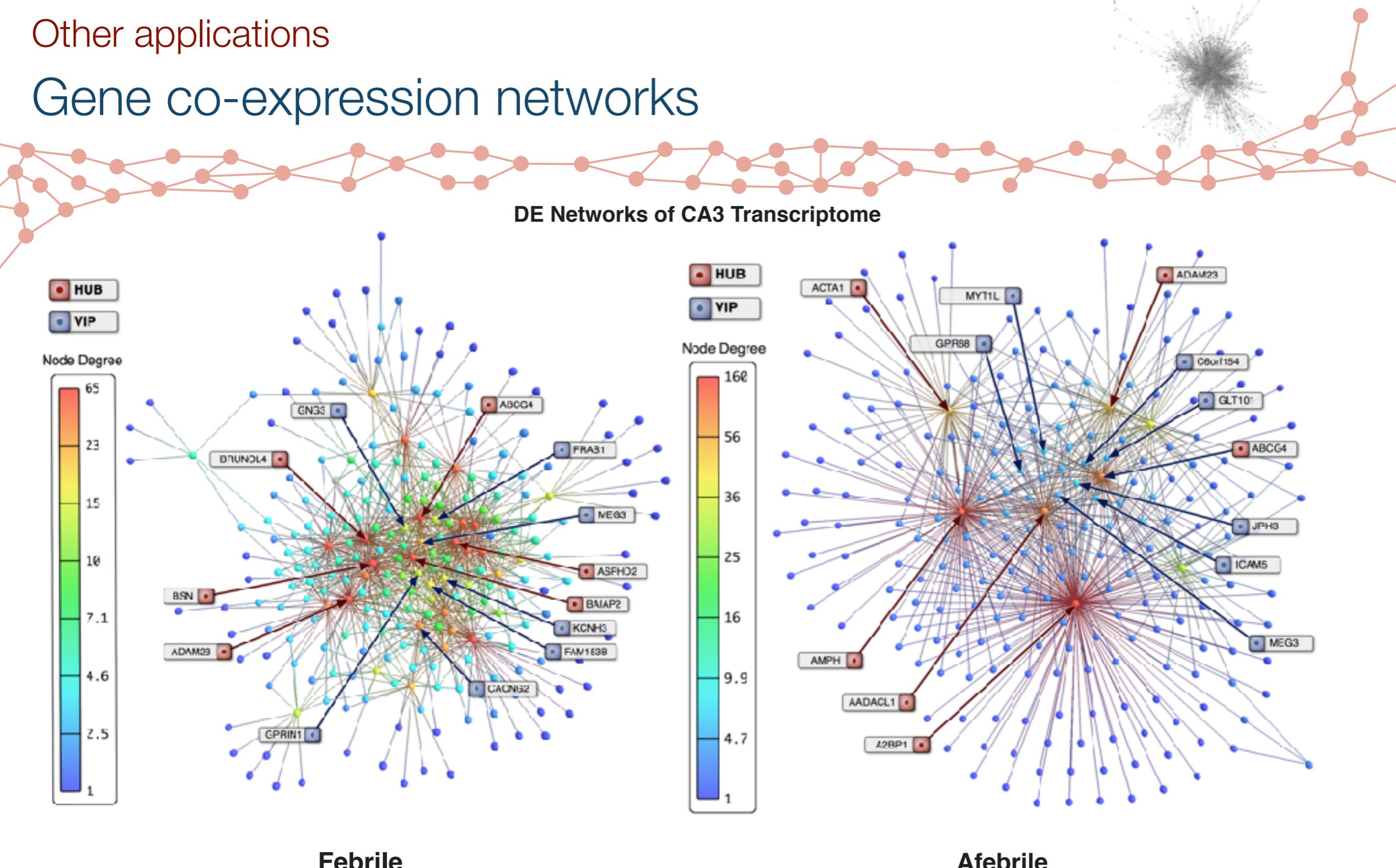


# Time evolving network during crisis



## Other applications

# Gene co-expression networks



“... wondering in his darker moments what Sally would say about that project when she heard of it, and he had hoped that she would not hear of it until all the preparations were so complete that interference would be impossible. He was extremely fond of Sally, but there was, he knew, a lamentable ...”

P. G. Wodehouse  
– *The Adventures of Sally*

# Removing functional words

“... wondering in his darker moments what Sally would say about that project when she heard of it, and he had hoped that she would not hear of it until all the preparations were so complete that interference would be impossible. He was extremely fond of Sally, but there was, he knew, a lamentable ...”

P. G. Wodehouse  
– *The Adventures of Sally*

# Lemmatization

“... wondering in his darker moments what Sally would say about that project when she heard of it, and he had hoped that she would not hear of it until all the preparations were so complete that interference would be impossible. He was extremely fond of Sally, but there was, he knew, a lamentable ...”

wonder dark

moment sally say

project hear

hope hear prepare

complete interference

impossible be extreme

fond sally know

lament

P. G. Wodehouse  
– *The Adventures of Sally*

wonder dark

moment sally say

project hear

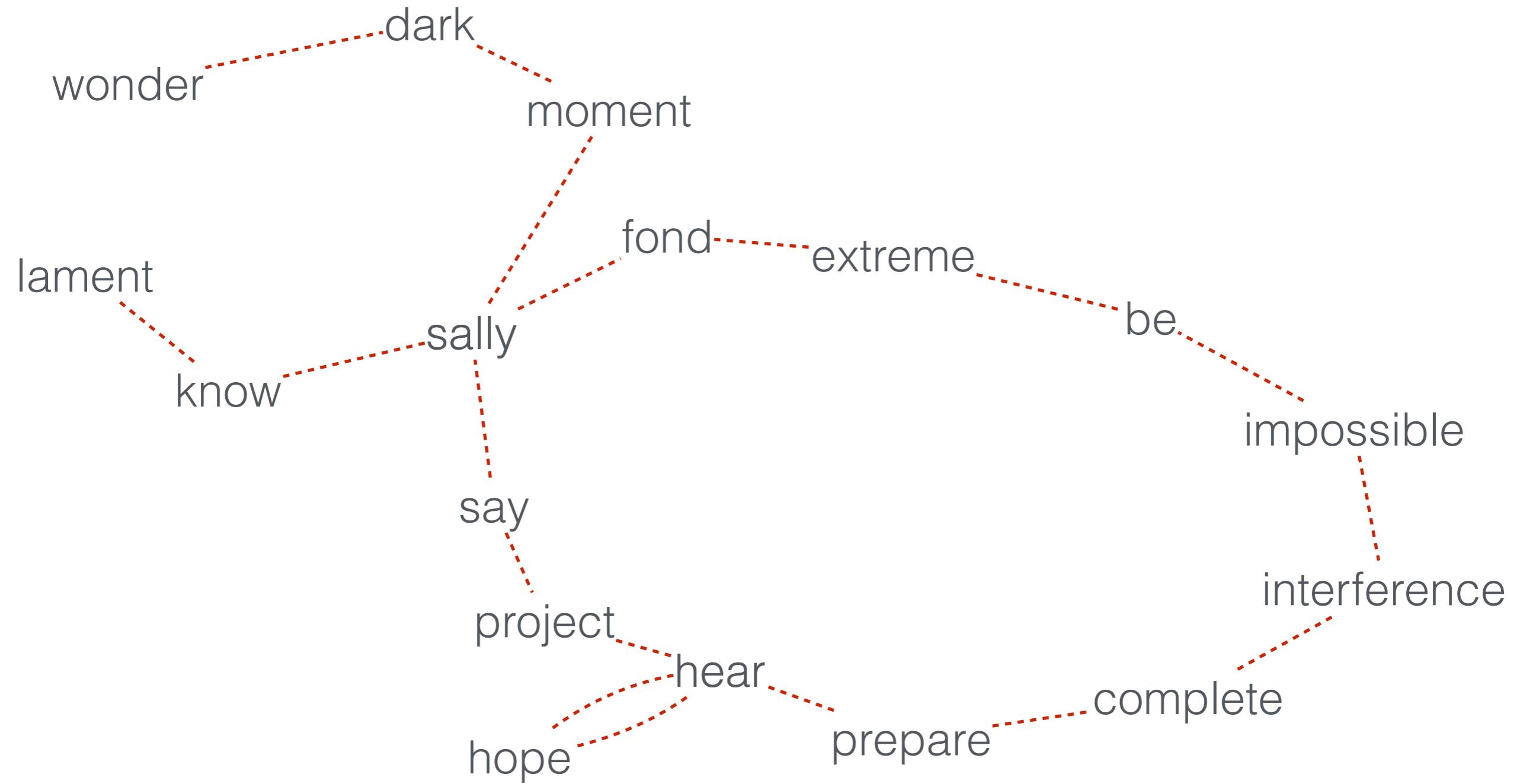
hope hear prepare

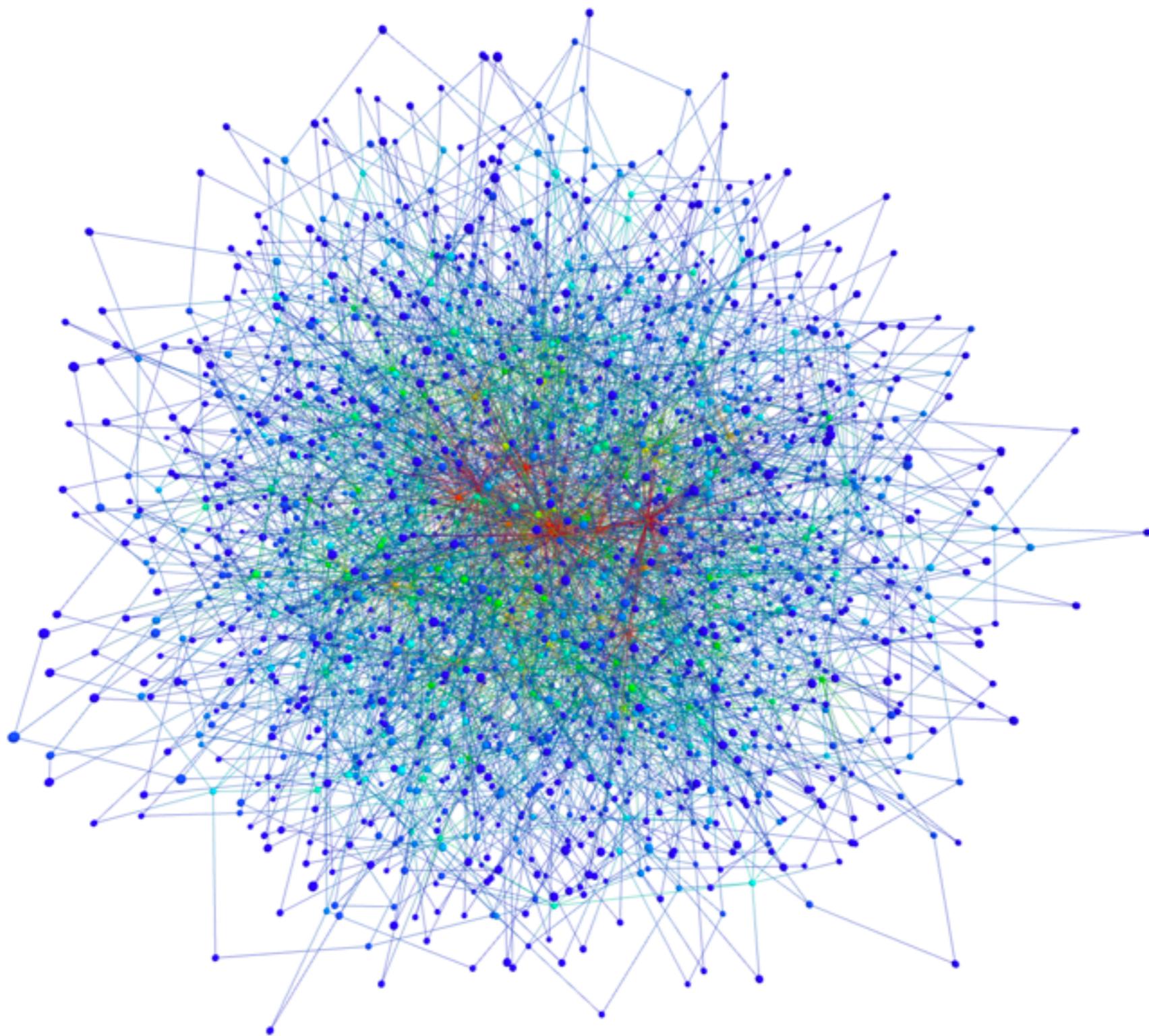
complete interference

impossible be extreme

fond sally know

lament





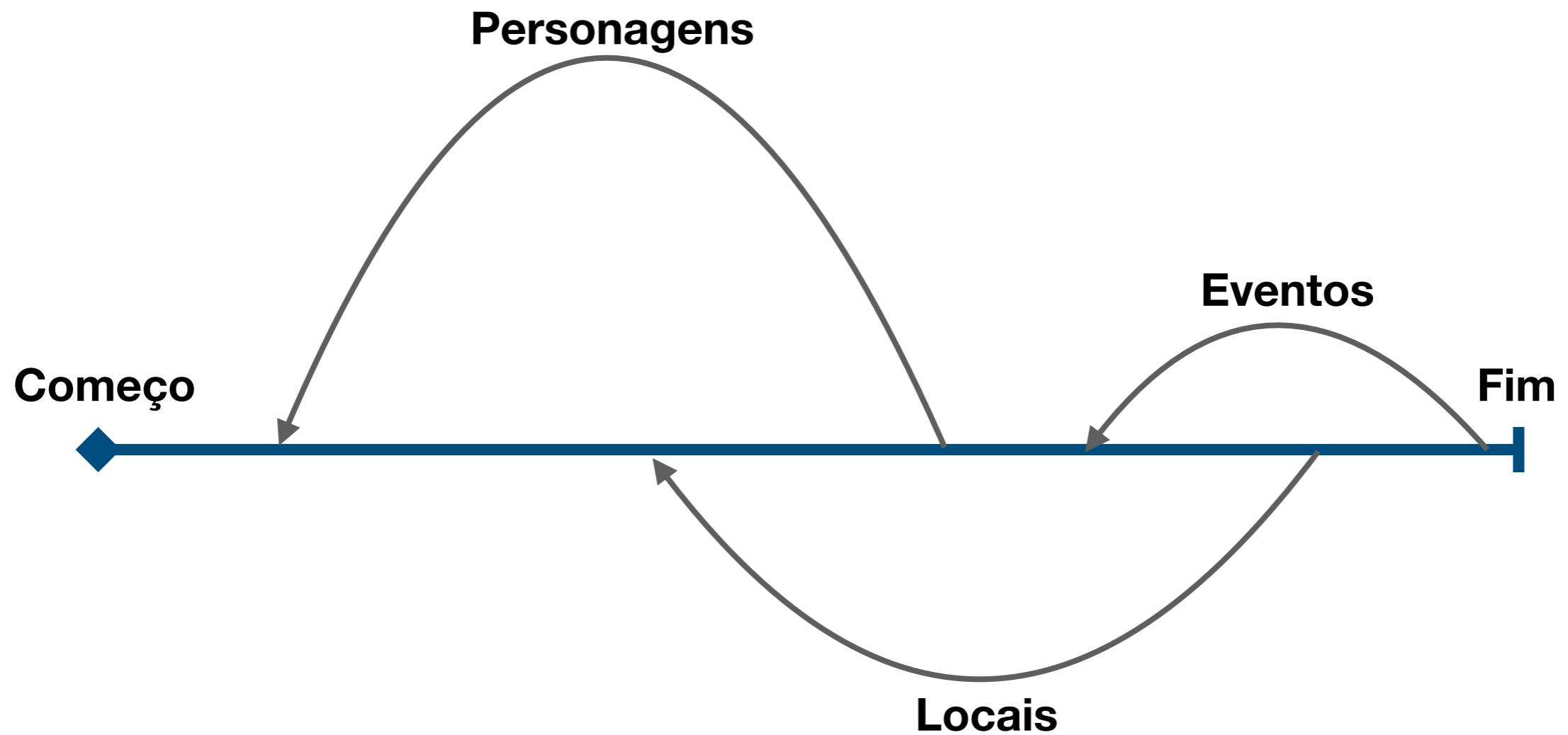
# Narrativa

**Começo**

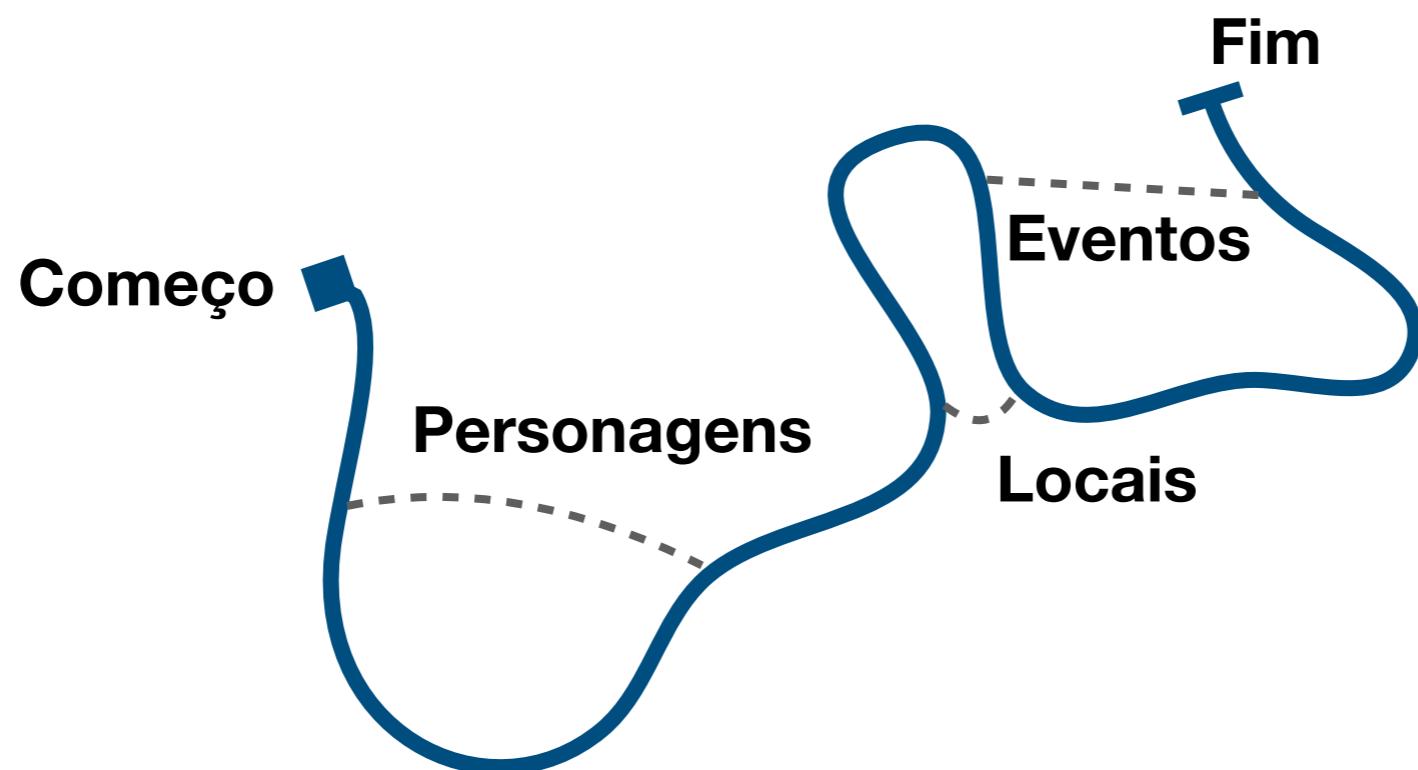


**Fim**

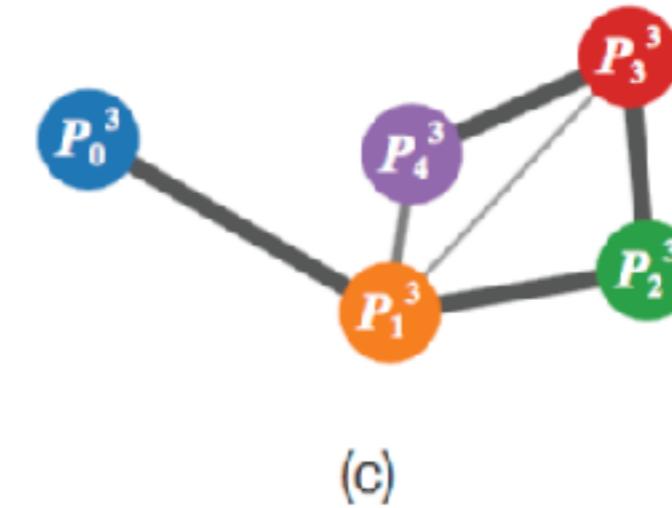
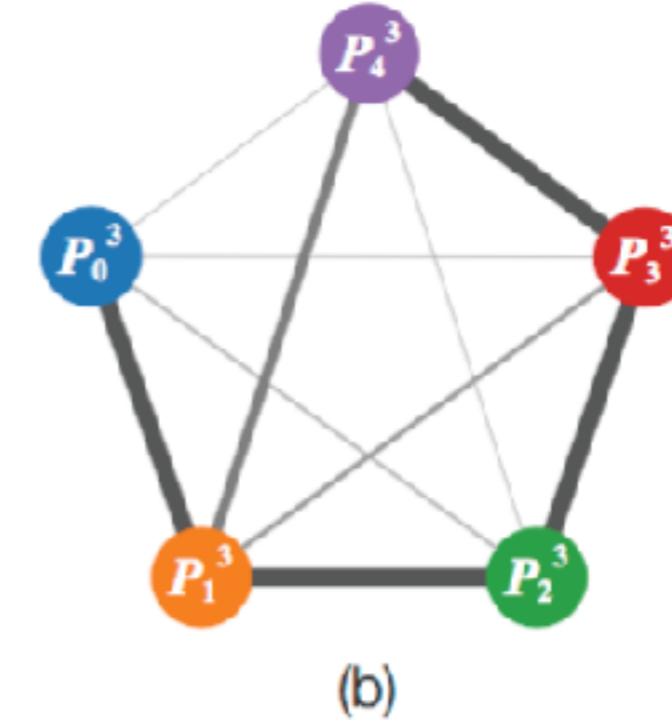
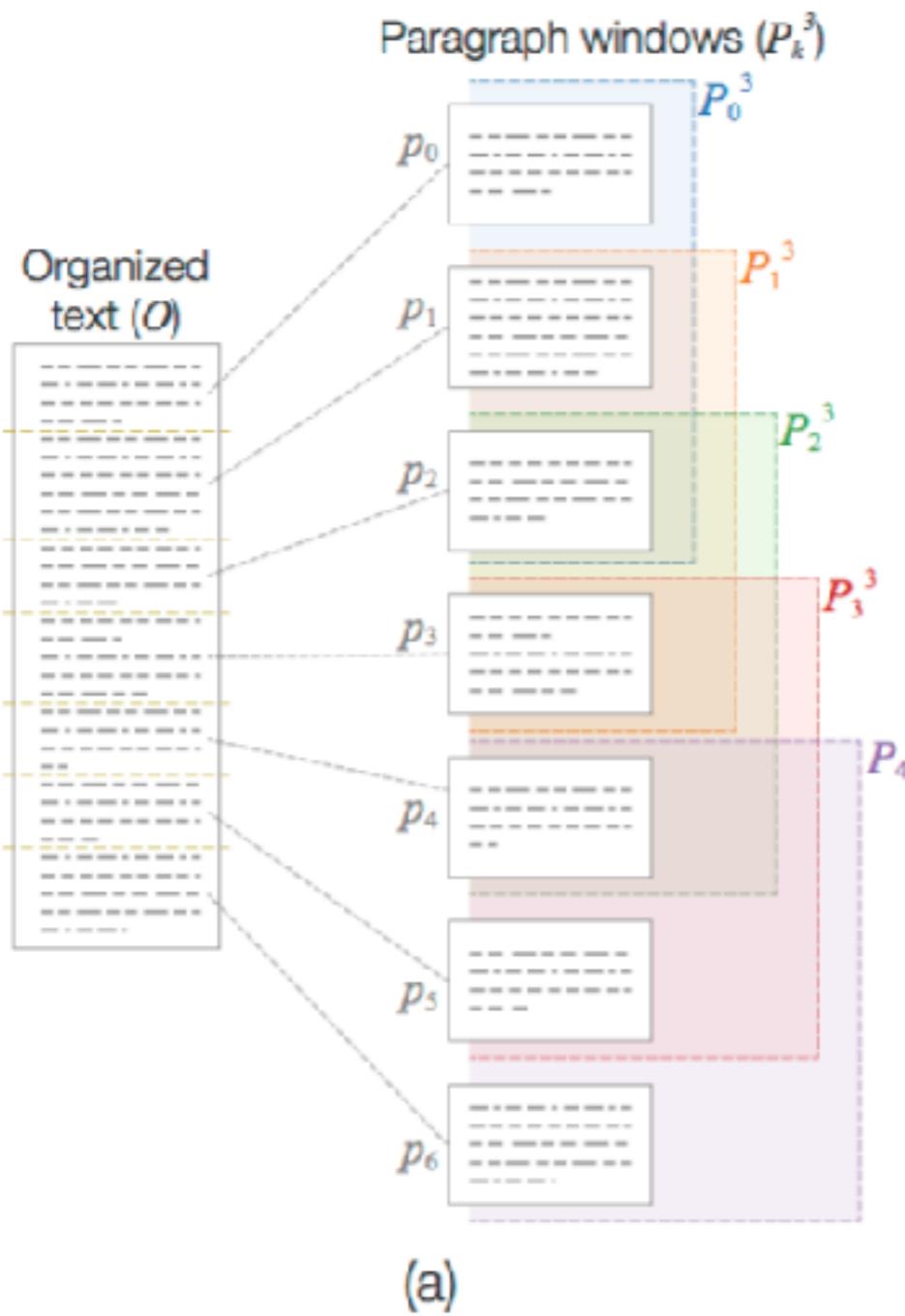
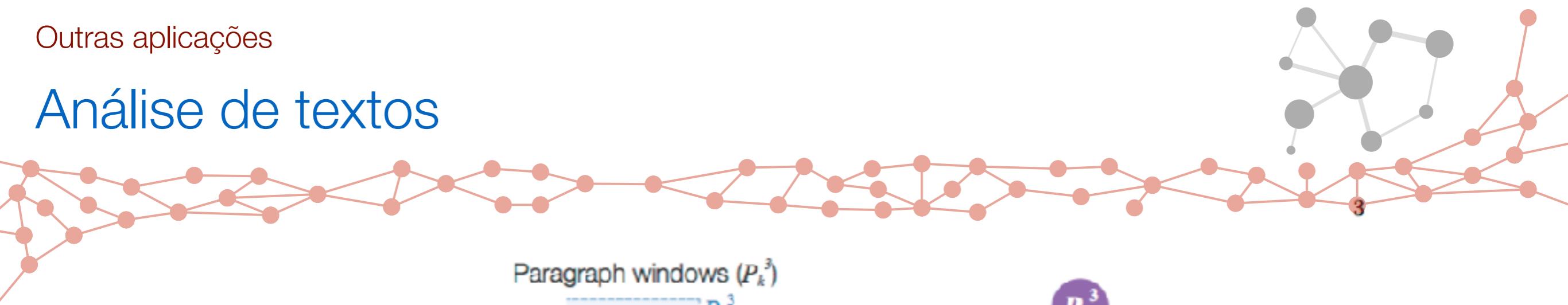
# Narrative



# Narrative

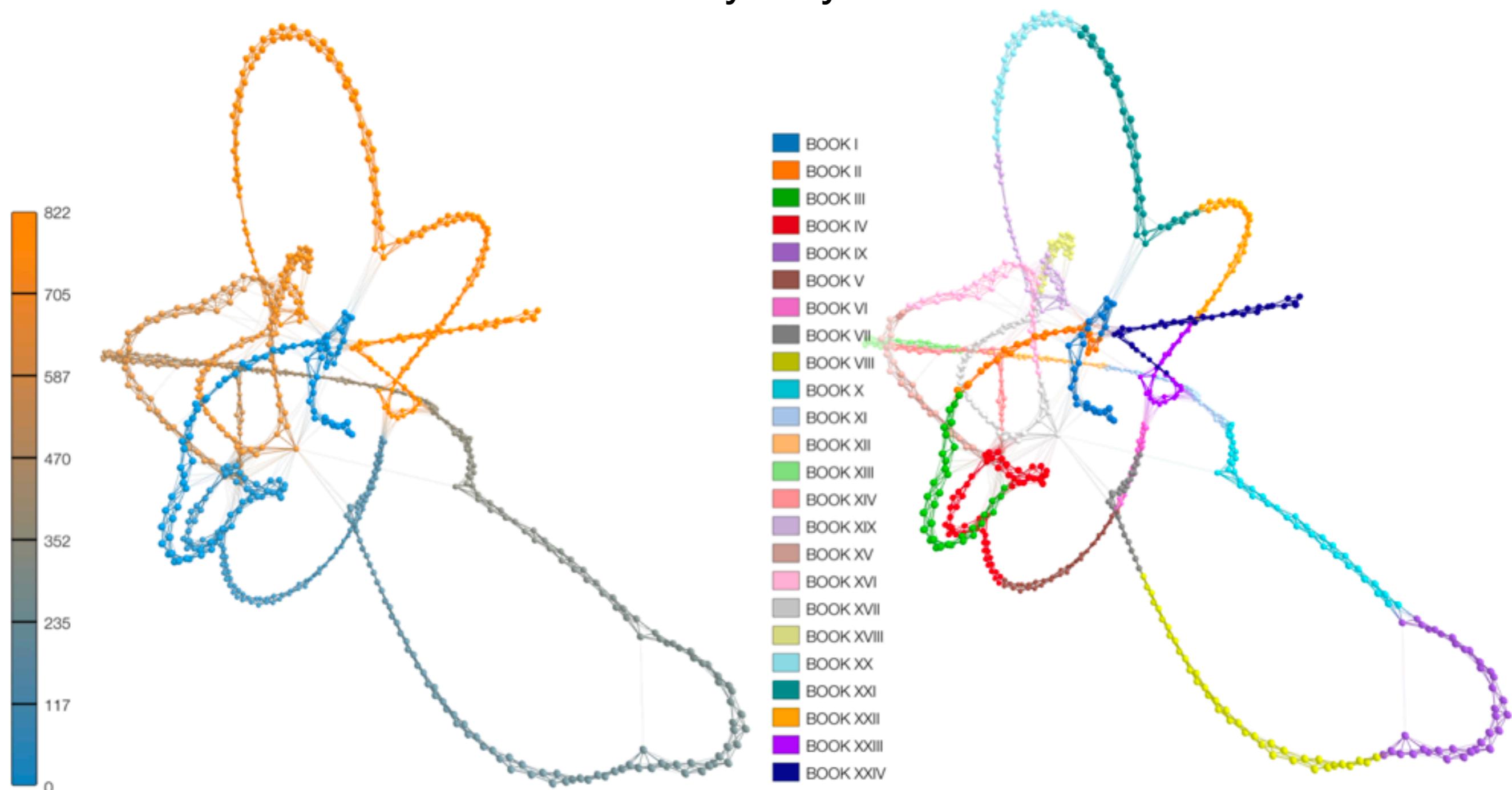


# Análise de textos

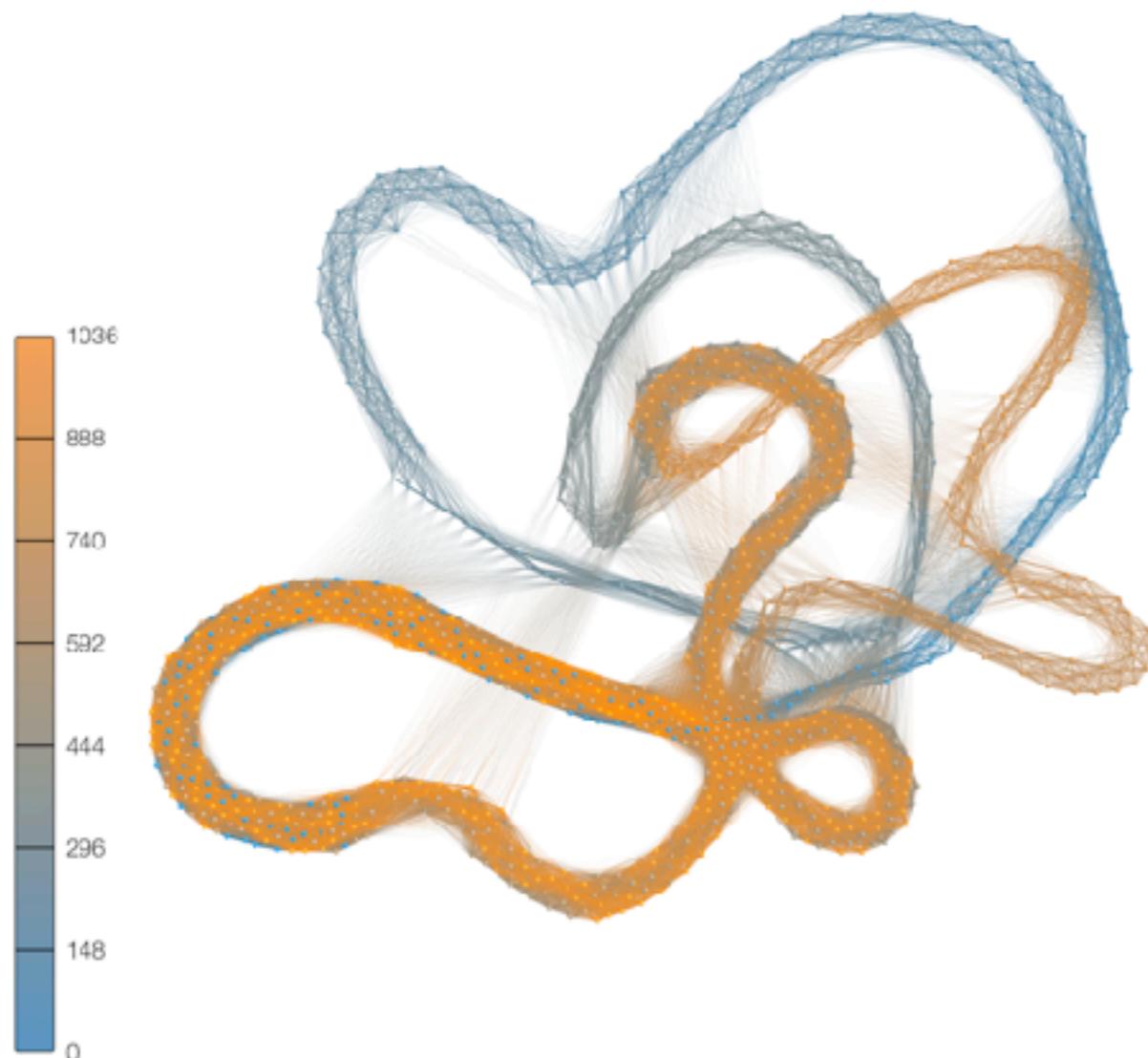


**Representation of texts as complex networks: a mesoscopic approach**  
*H. F. de Arruda, F. N. Silva, V. Q. Marinho, D. R. Amancio, L. da F. Costa*  
*Journal of Complex Networks, p. cnx023, 2017*  
<https://arxiv.org/abs/1606.09636>

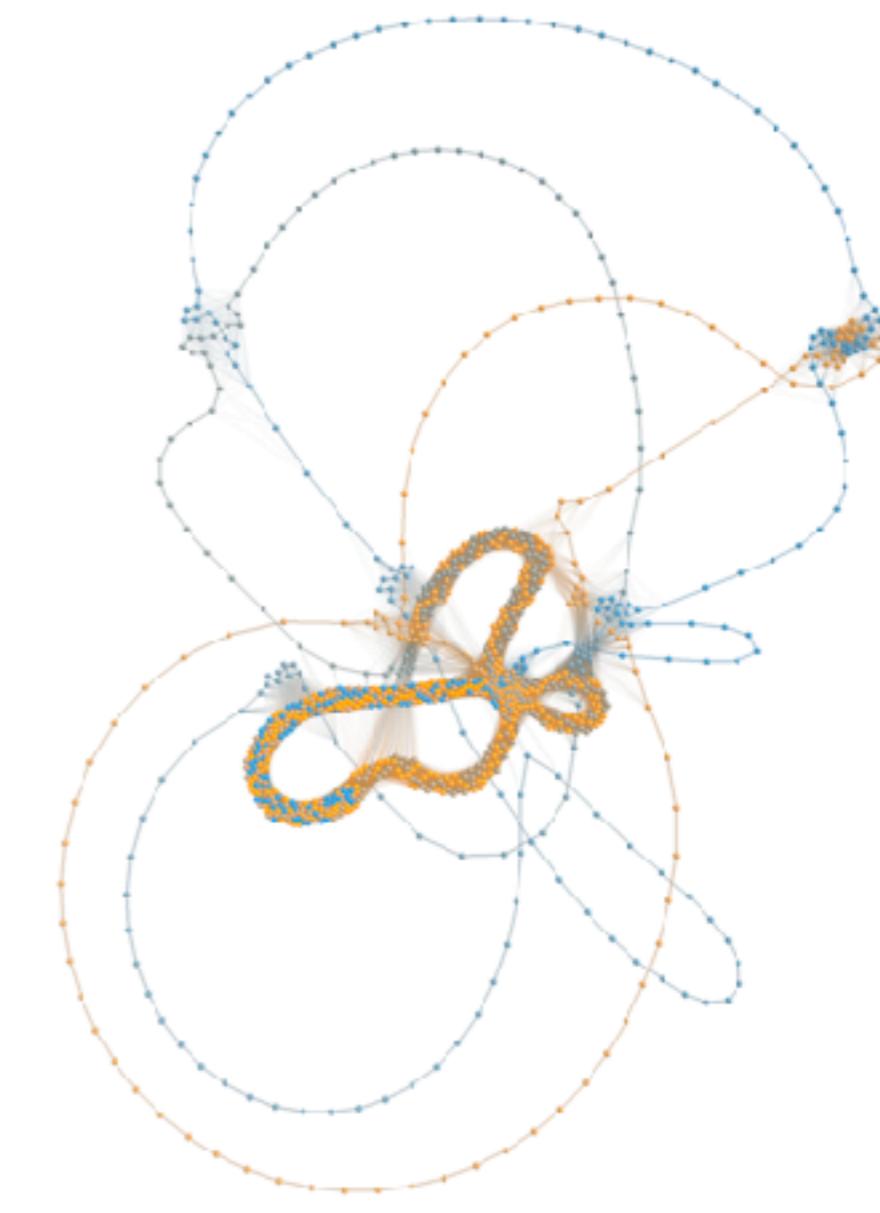
# Odyssey



# Lyrics

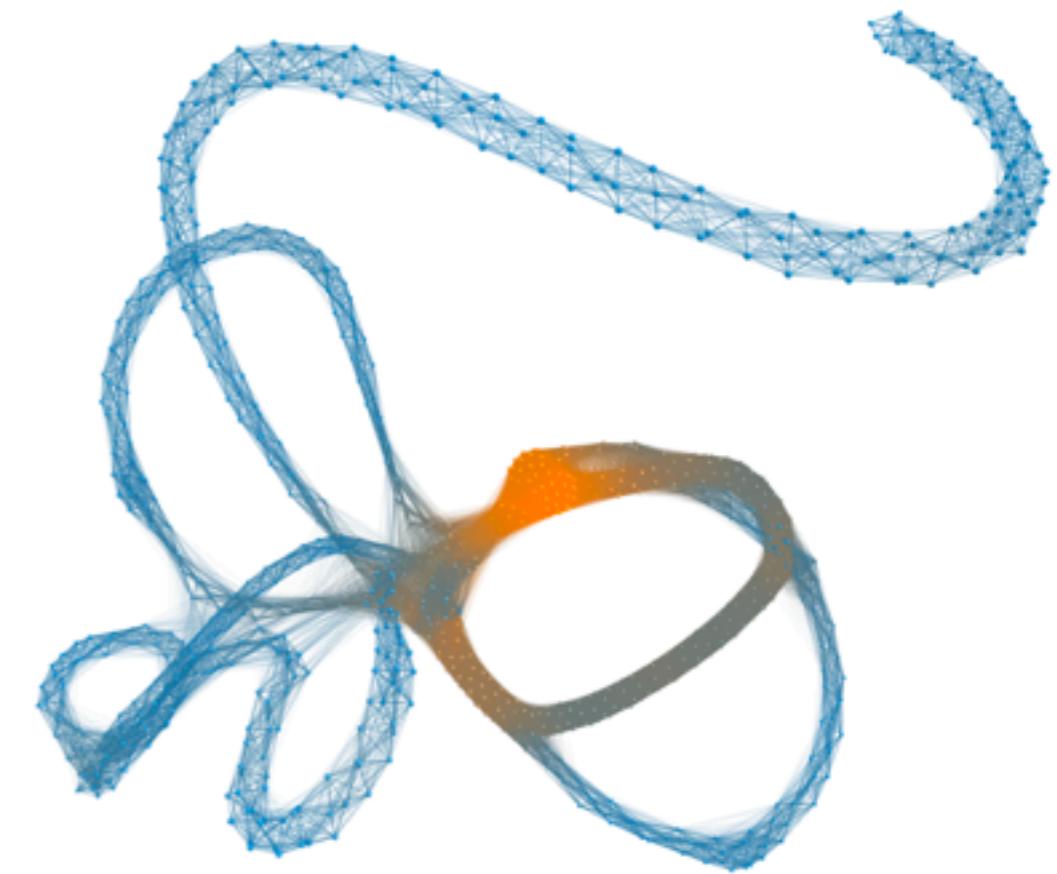
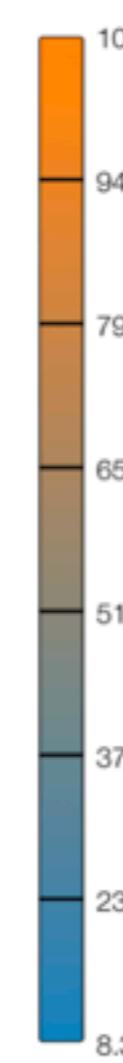
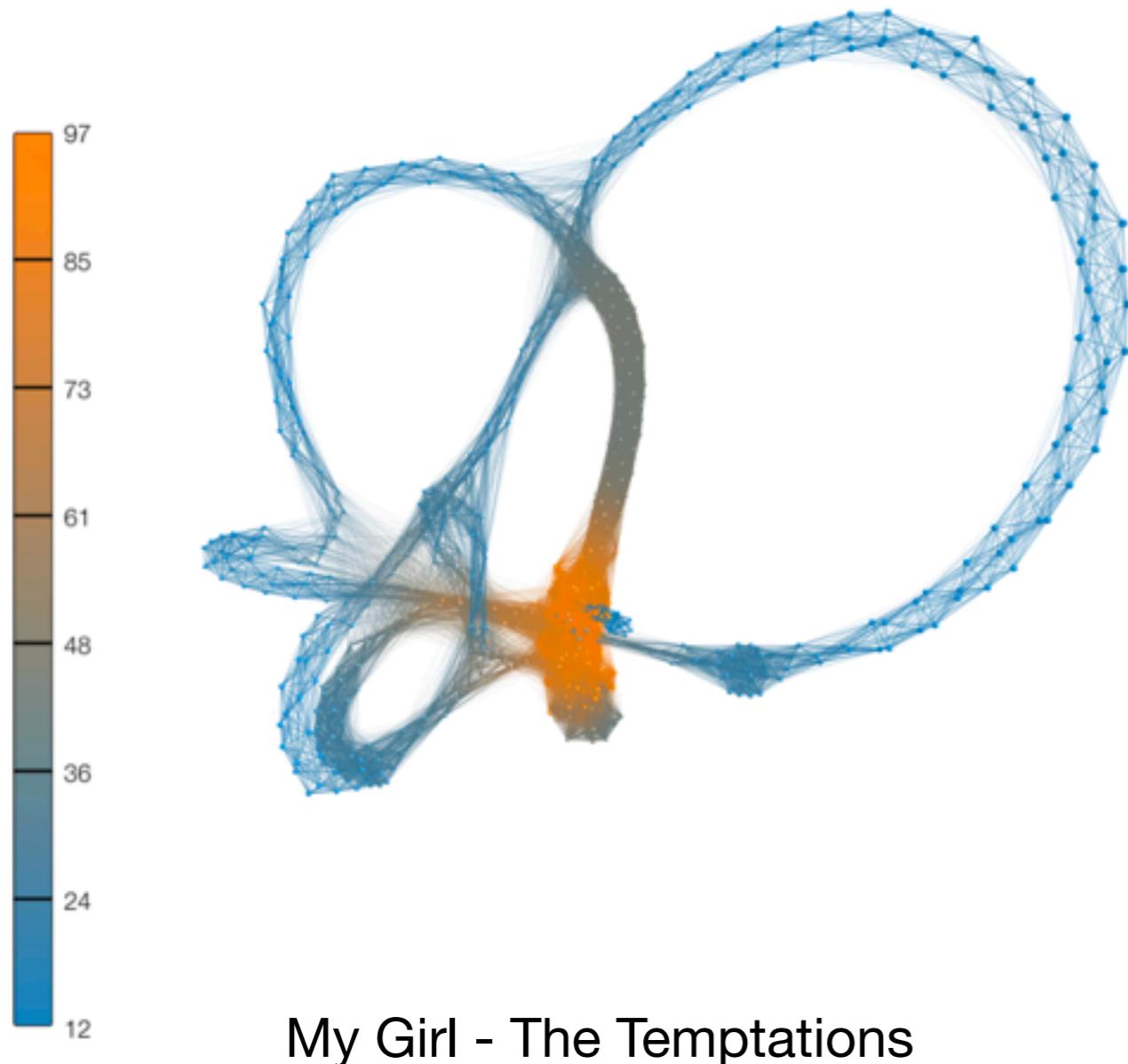


Dancing Queen - ABBA



Pruned version

# Lyrics

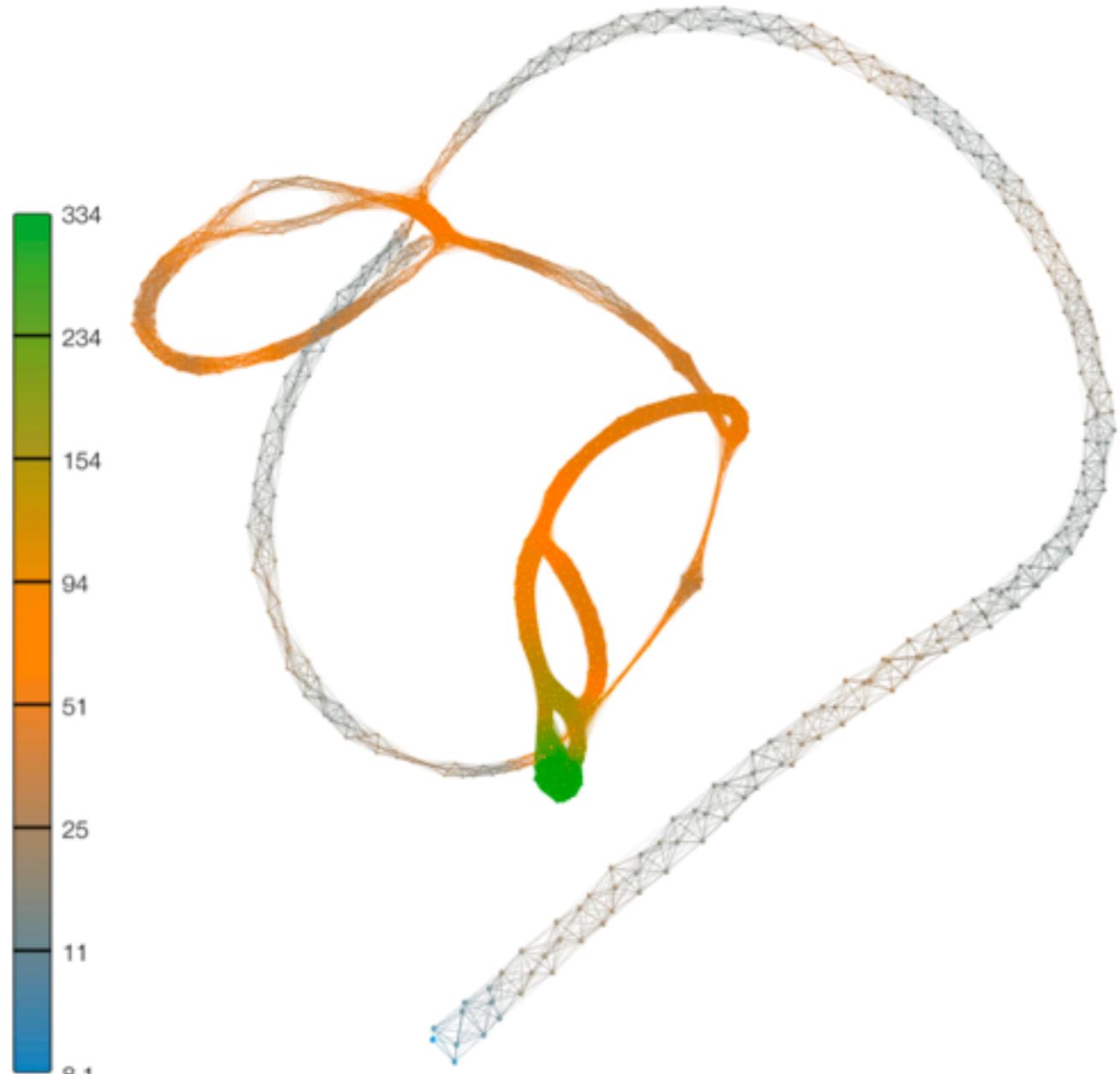


Footloose - Kenny Loggins

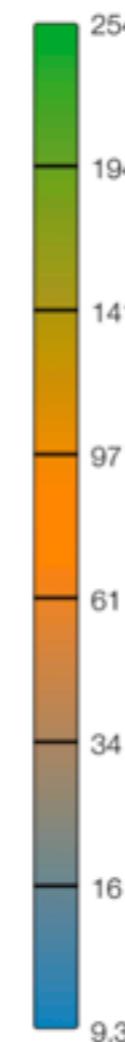
Mesoscopic Network Analyses of Song Lyrics

H. F. de Arruda, F. N. Silva, A. de A. Costa, S. M. Reia, D. R. Amancio, L. da F. Costa  
(In preparation)

# Lyrics

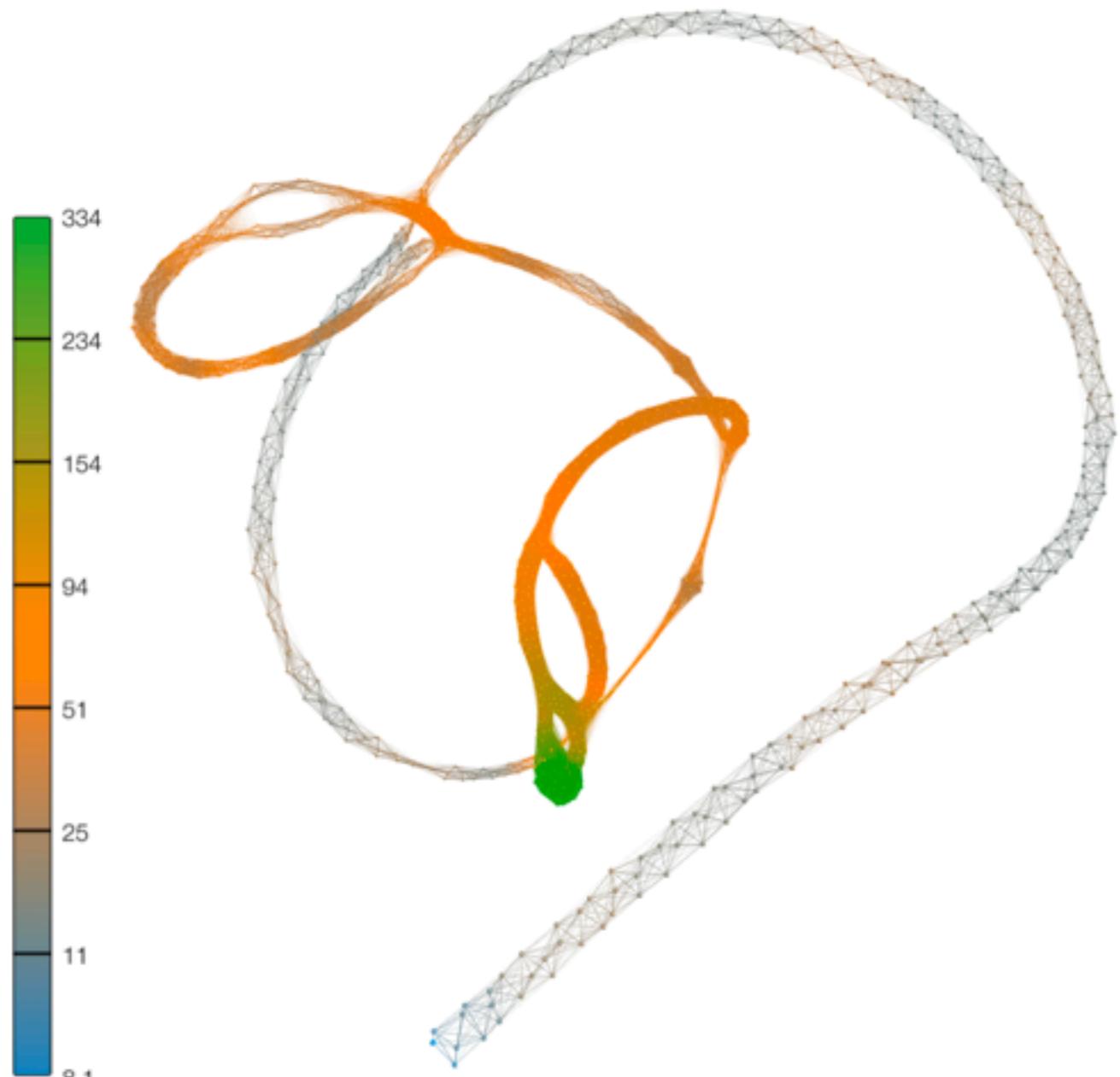


Roar - Kate Perry

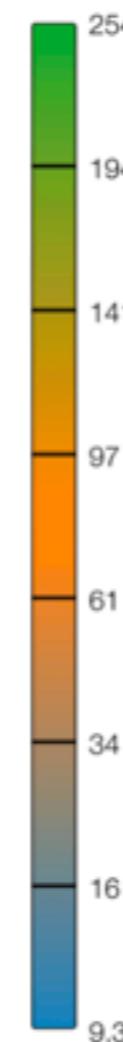


Baby - Justin Bieber

# Lyrics

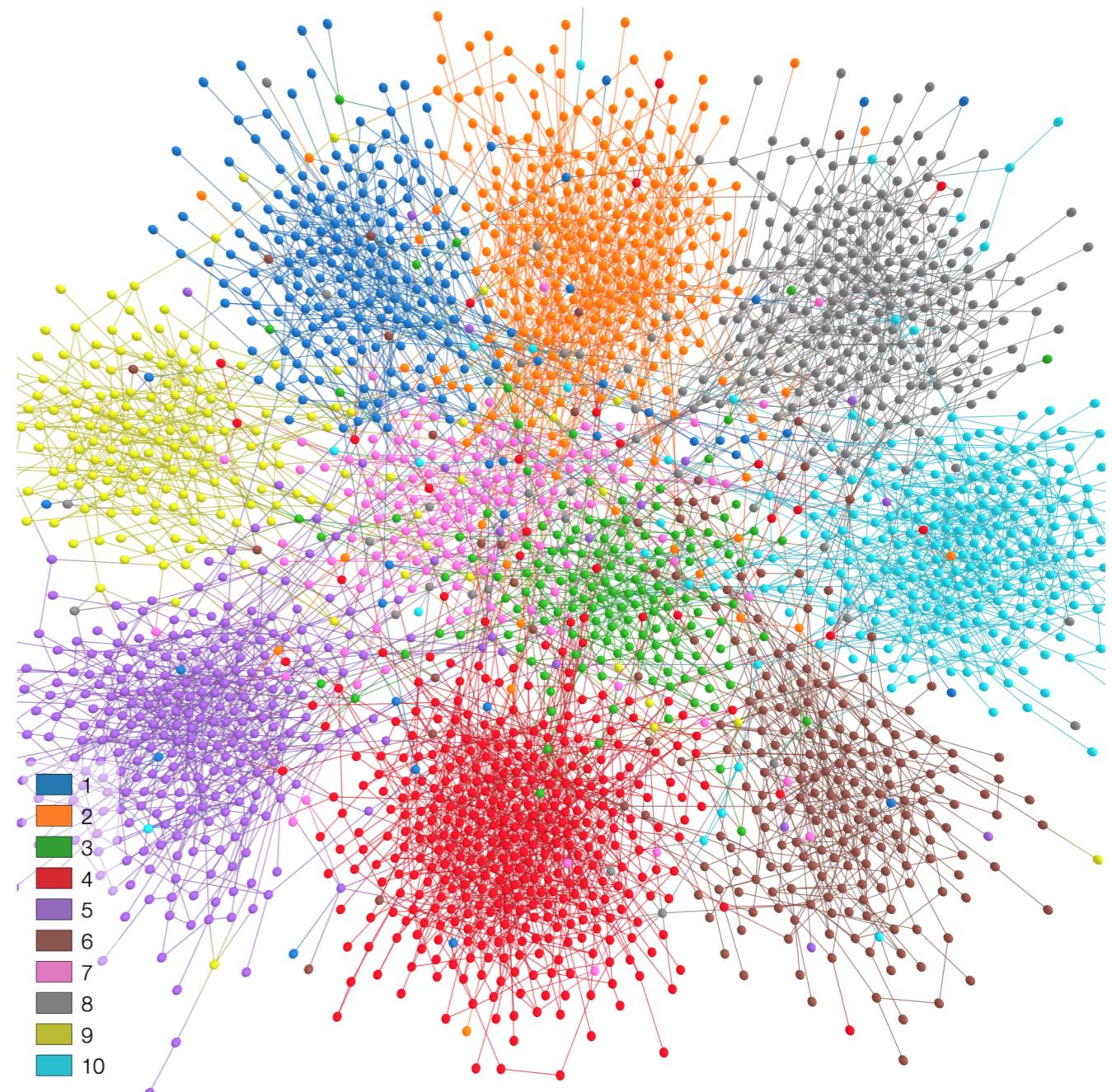
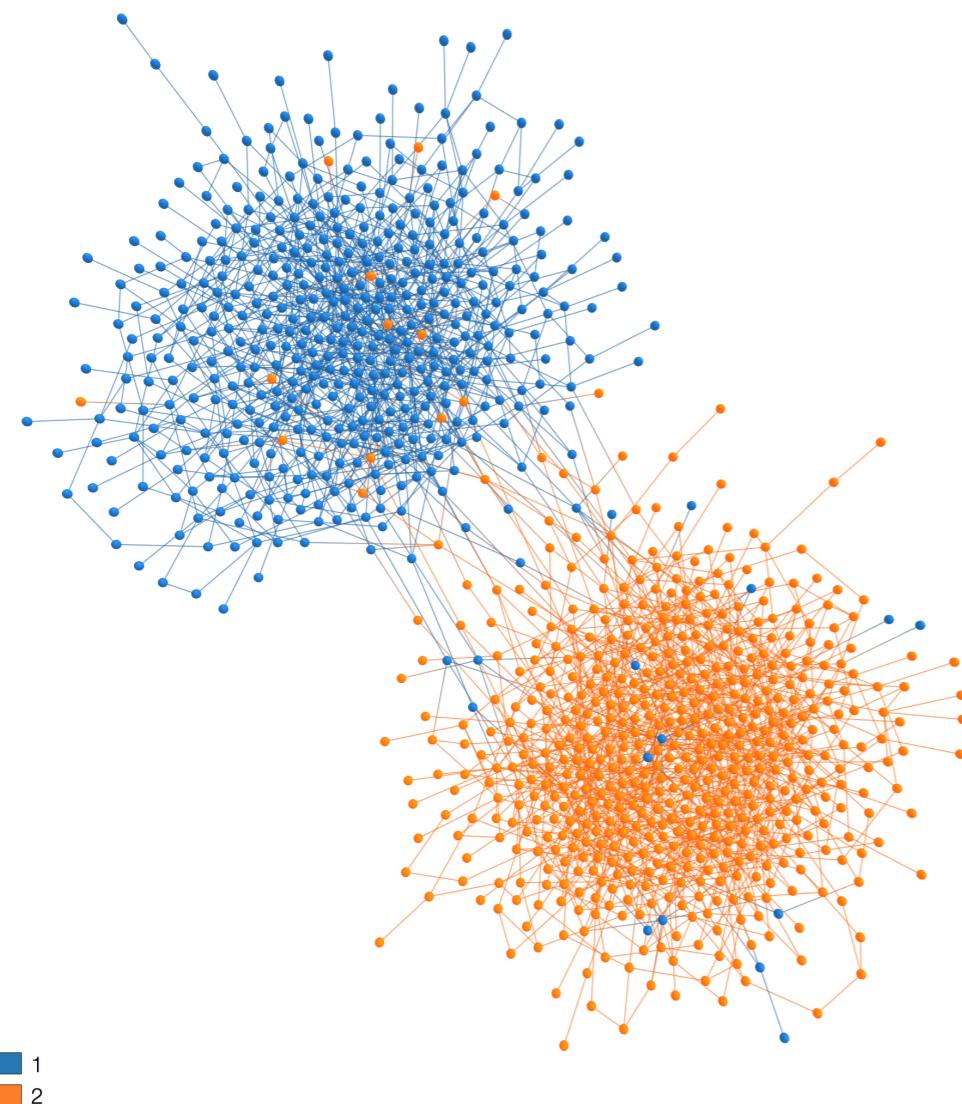


Roar - Kate Perry



Baby - Justin Bieber

# Social Bubbles dynamics using Sznajd Model



Opinion Diversity and Social Bubbles in Adaptive Sznajd Networks  
A Benatti, HF de Arruda, FN Silva, CH Comin, LF Costa  
arXiv preprint arXiv:1905.00867

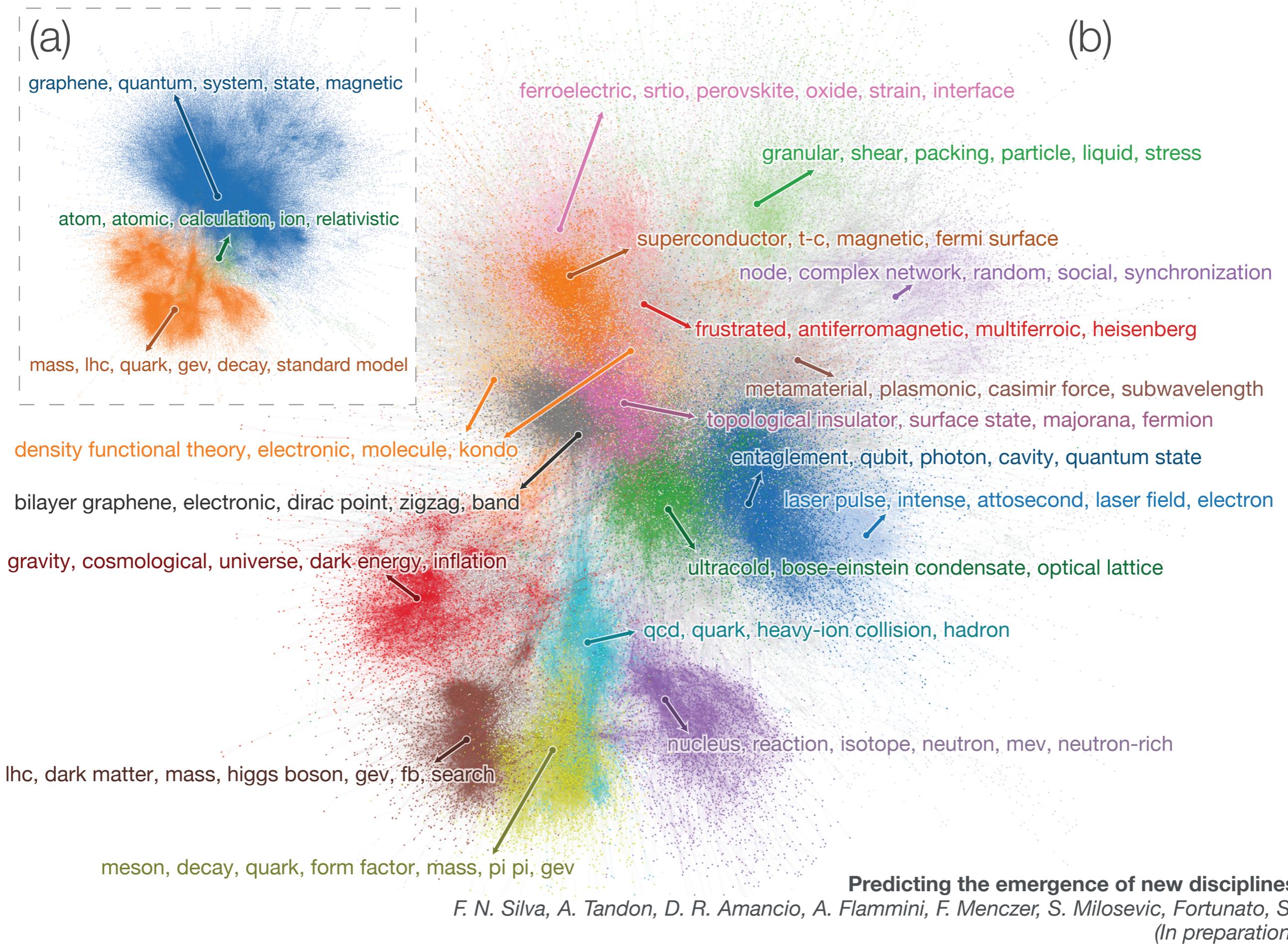
Physics

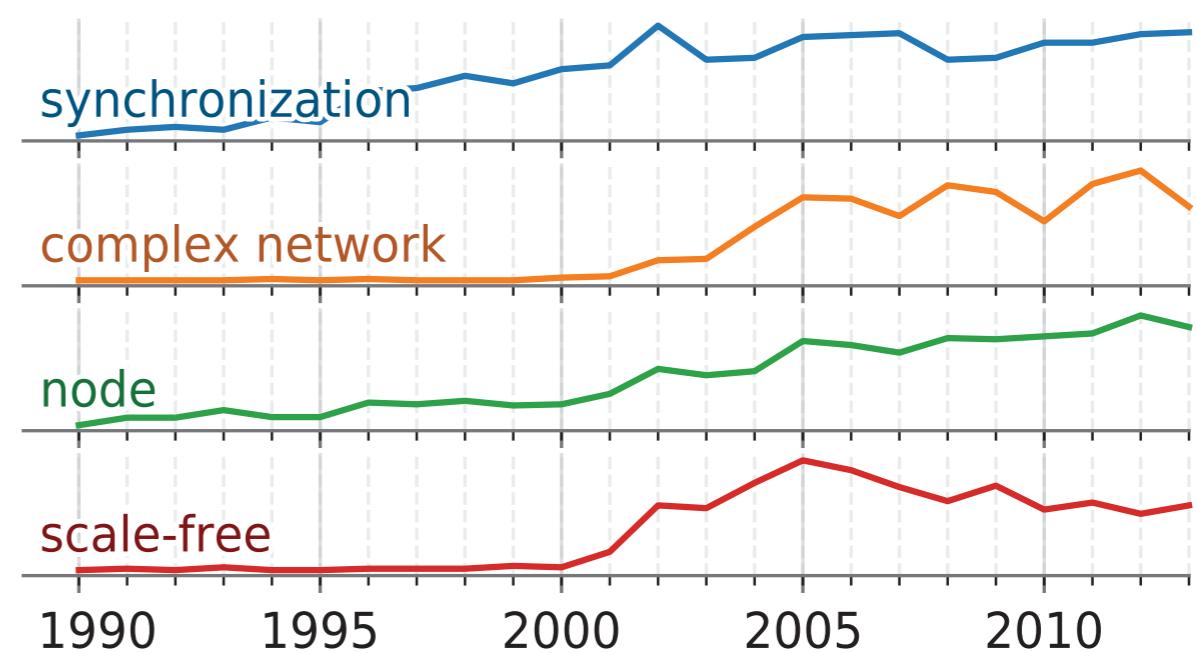
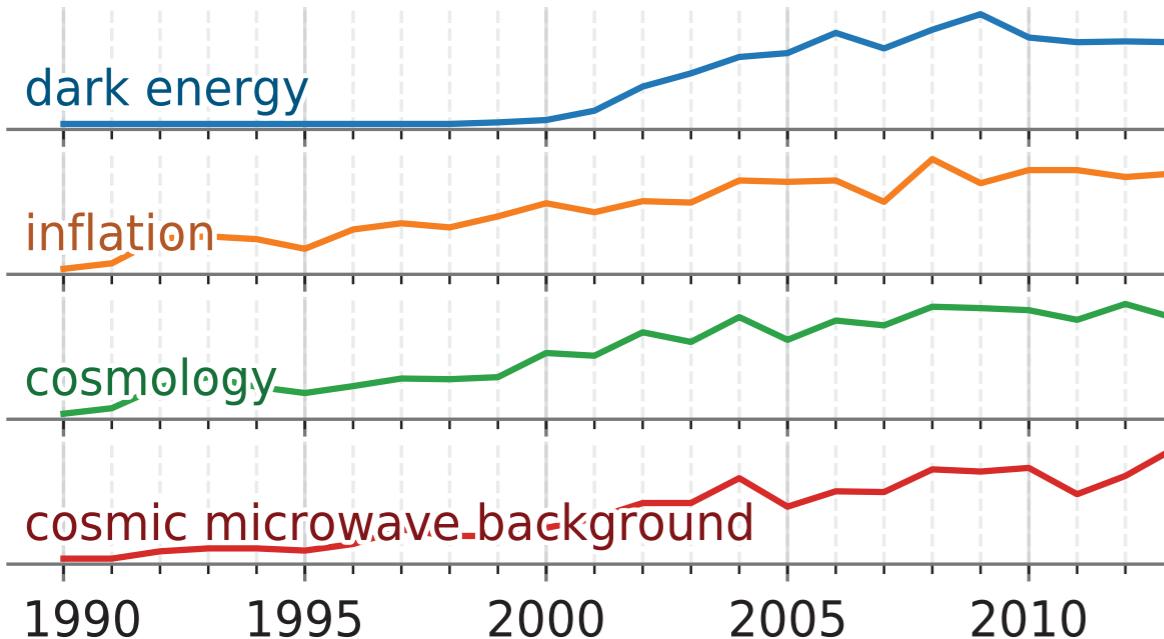
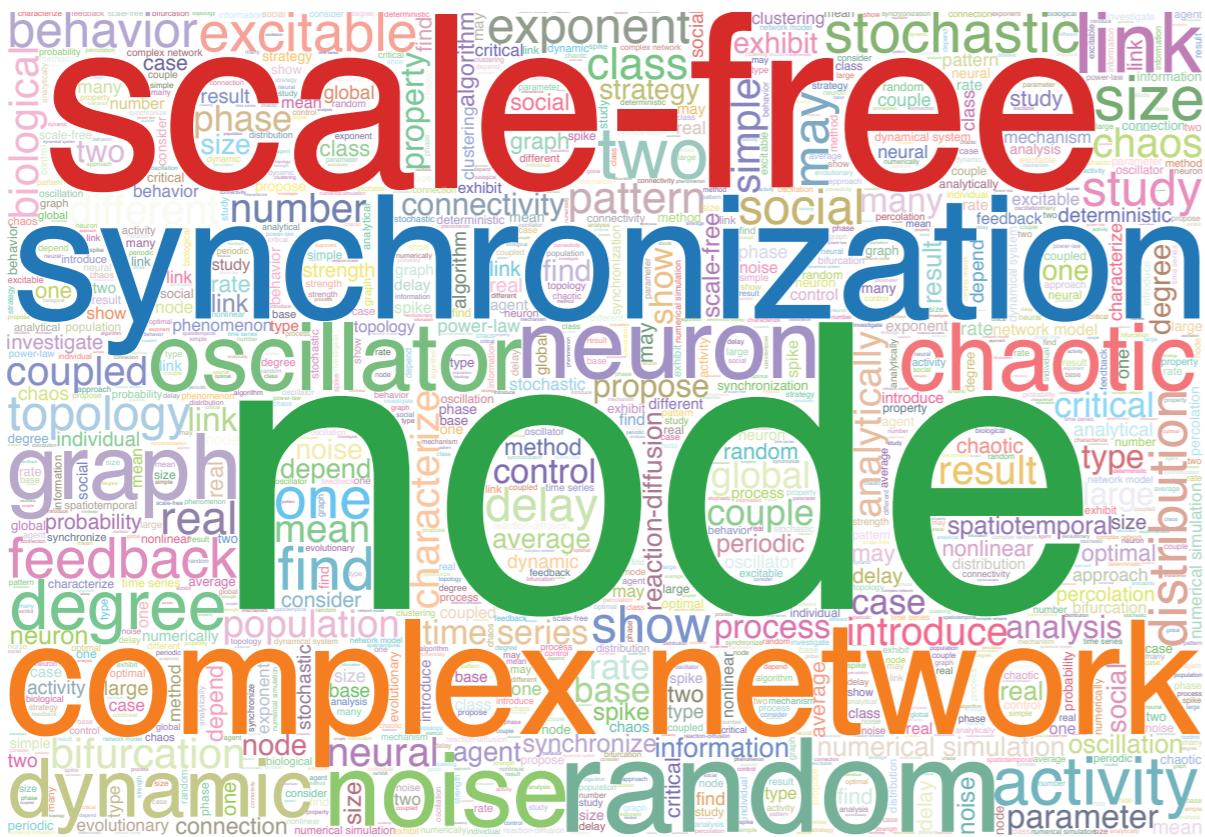
Chemistry



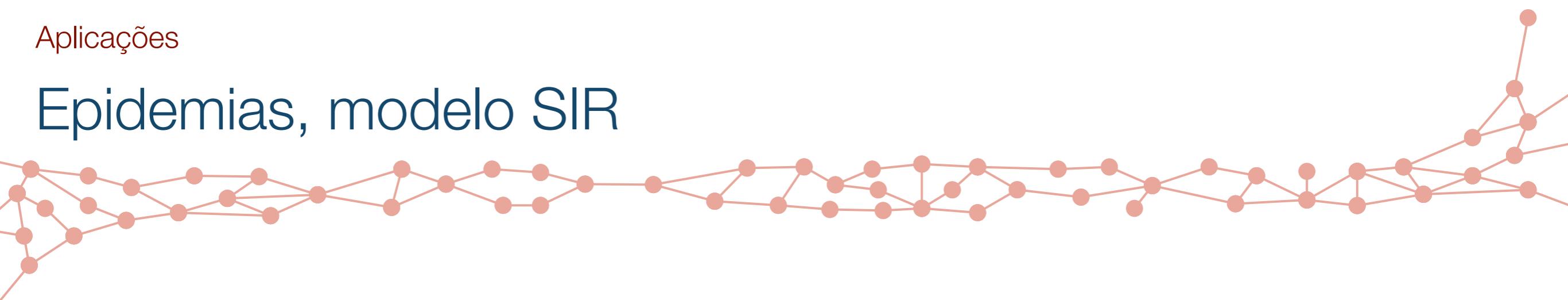
Biology

# Dynamics of scientific disciplines





# Epidemias, modelo SIR



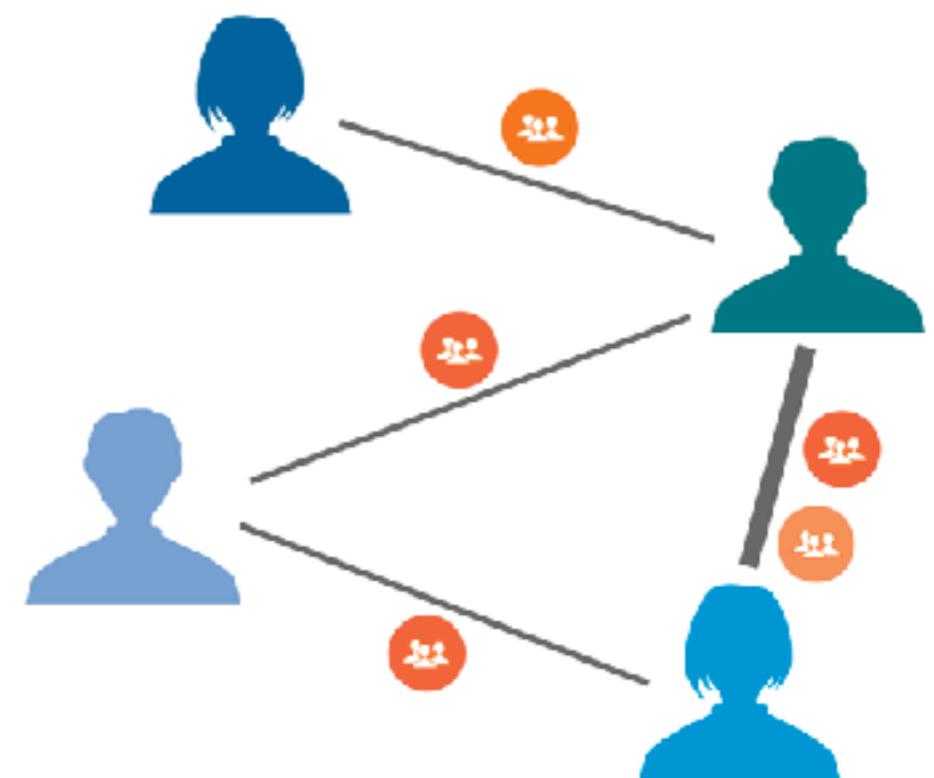
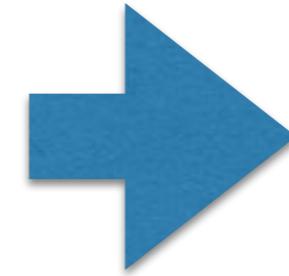
Students



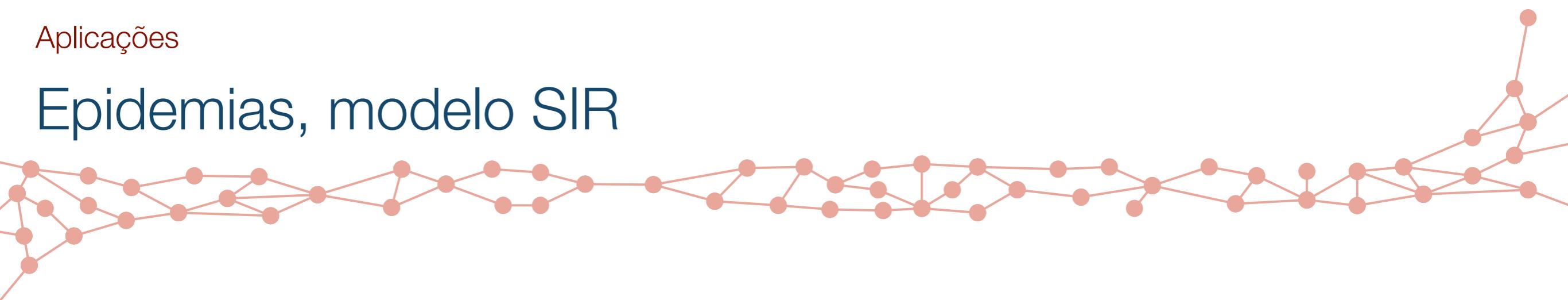
Classes



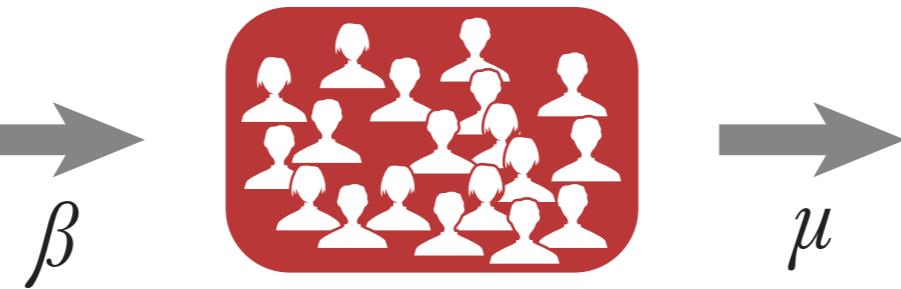
⋮



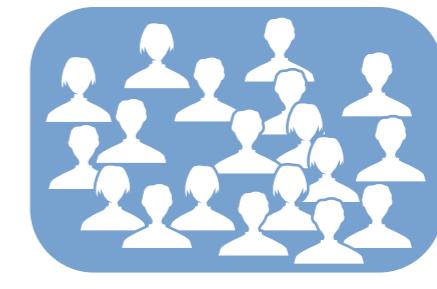
# Epidemias, modelo SIR



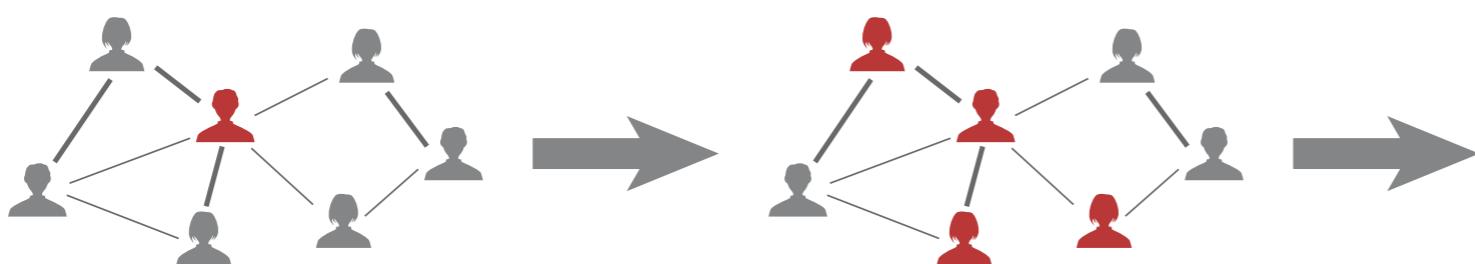
Susceptible



Infected

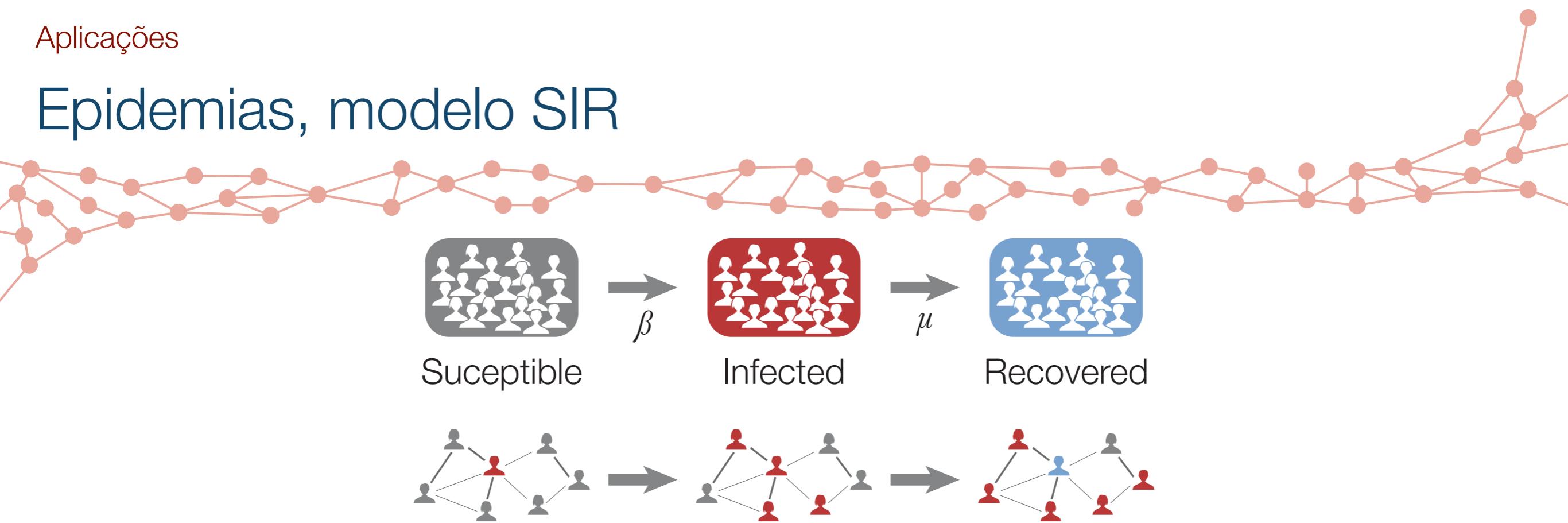


Recovered

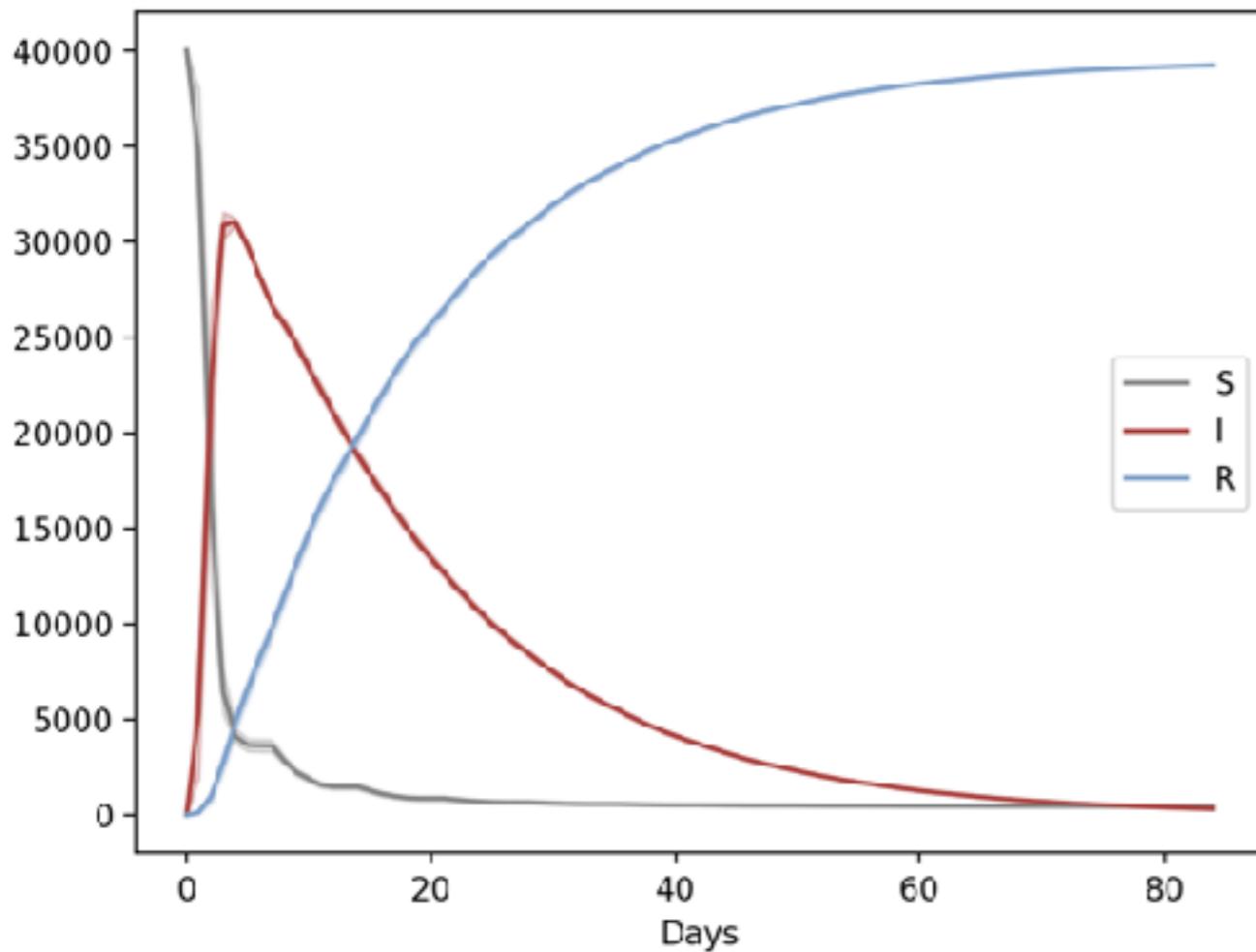


Aplicações

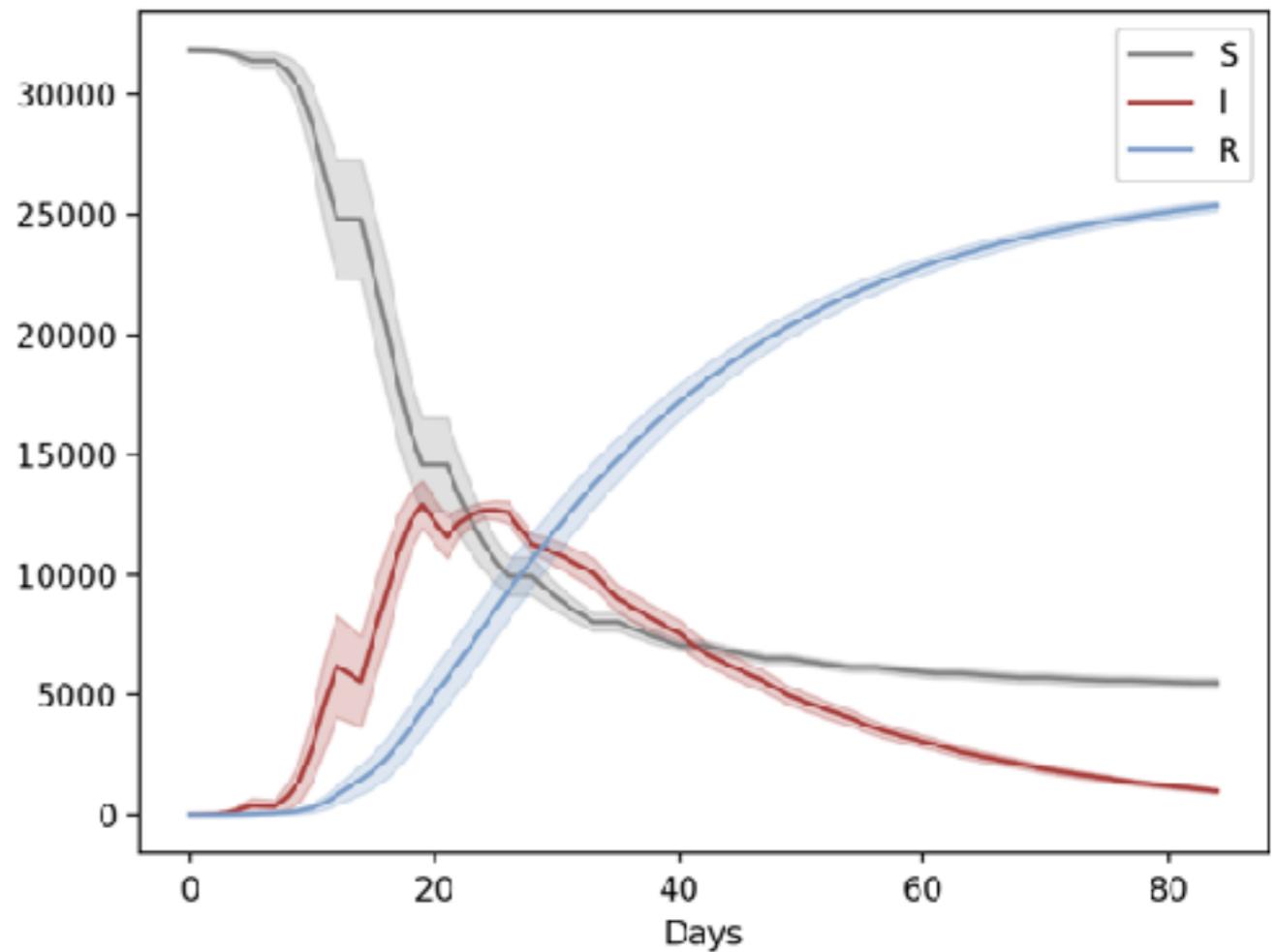
## Epidemias, modelo SIR

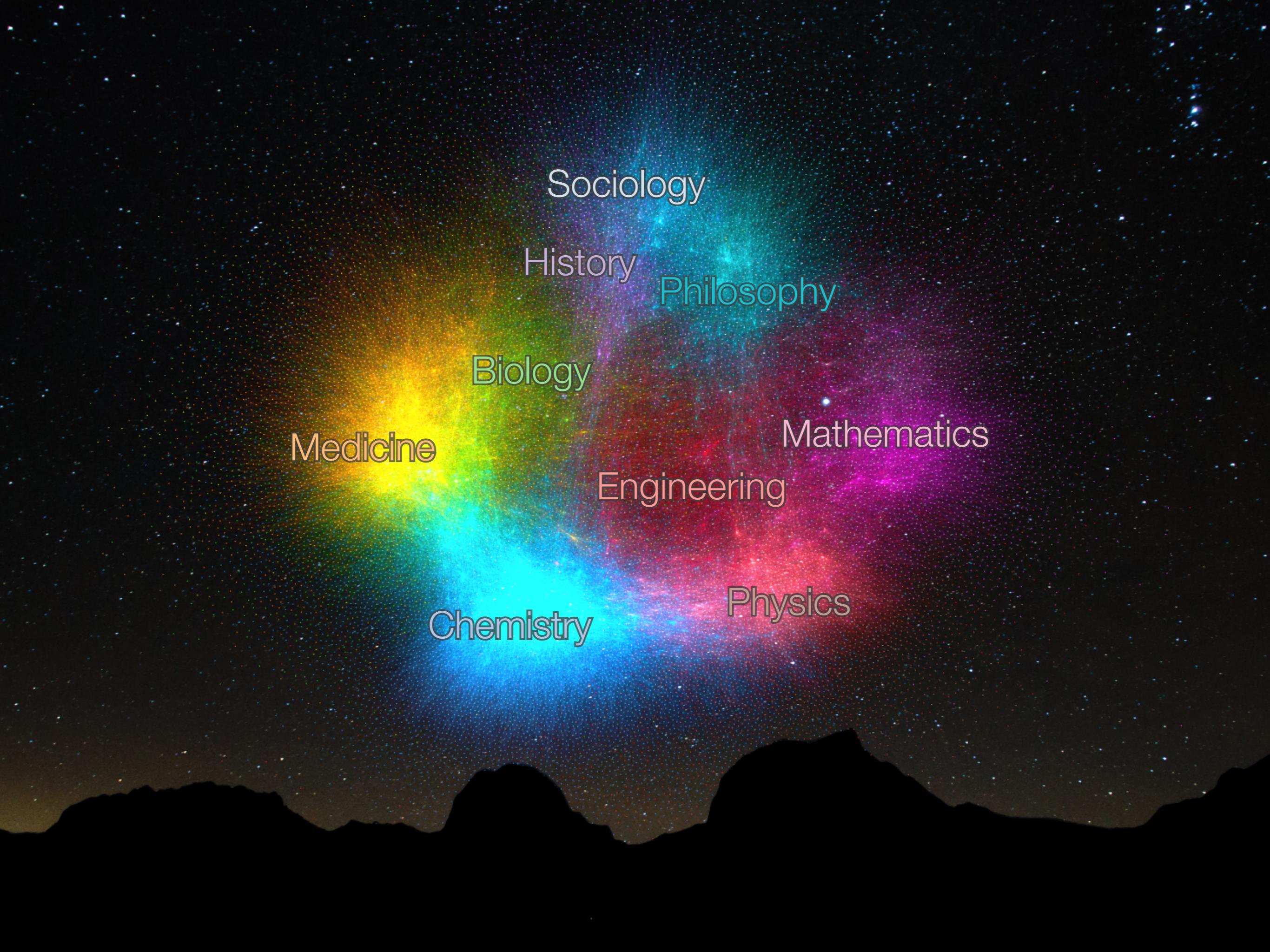


Todas as classes



50% das classes online



The background of the image features a vibrant, multi-colored nebula with swirling patterns of yellow, orange, red, green, blue, and purple. At the very bottom, there are dark, silhouetted shapes resembling the outlines of mountains or hills against the star-filled sky.

Sociology

History

Philosophy

Biology

Medicine

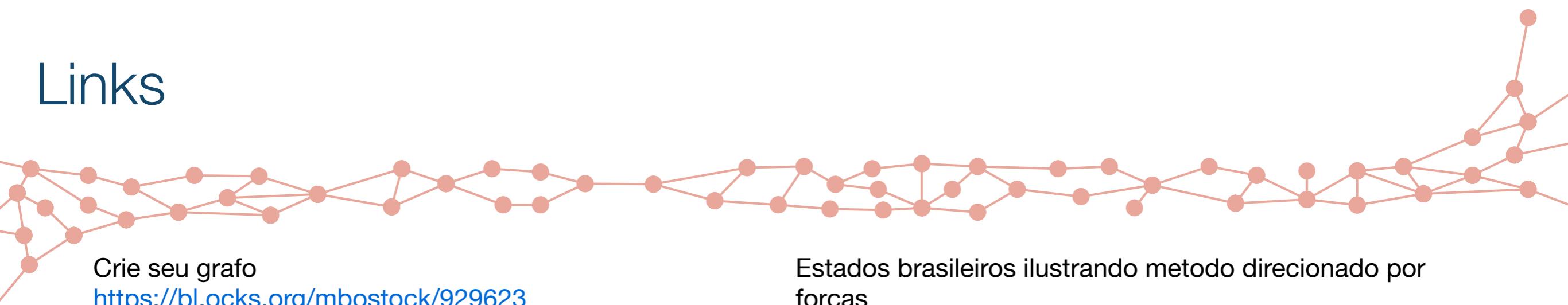
Mathematics

Engineering

Chemistry

Physics

# Links



Crie seu grafo  
<https://bl.ocks.org/mbostock/929623>

Crie seu grafo dirigido  
<http://bl.ocks.org/rkirslng/5001347>

Jogo vacinação baseado em redes  
<vax.herokuapp.com>

Modelo SIR  
<http://bl.ocks.org/ccattuto/raw/5892995/>

Modelo Erdos-Renyi  
<http://bl.ocks.org/christophermanning/4187201>

Modelo Barabasi-Albert  
<https://bl.ocks.org/filipinascimento/raw/20357a893d16df569e8925d14d9533f5/>

Visualizações  
<http://cyvision.ifsc.usp.br/networktools/>

Links vídeos de visualização de redes  
[https://youtu.be/jy5Dx\\_W9knc](https://youtu.be/jy5Dx_W9knc)

Estados brasileiros ilustrando metodo direcionado por forças

<https://bl.ocks.org/filipinascimento/raw/e656330ffd3ffcfaa59216d869fc06>

Textos didáticos sobre redes complexas (CDT, em inglês)  
<https://www.researchgate.net/project/Costas-Didactic-Texts-CDTs>

Documentário: Seis graus de separação.  
[www.youtube.com/watch?v=BQ7UDWn\\_uws](http://www.youtube.com/watch?v=BQ7UDWn_uws)

Nerdologia: Seis graus de separação  
[www.youtube.com/watch?v=YMI3CrChwSk](http://www.youtube.com/watch?v=YMI3CrChwSk)

Site do livro sobre o assunto  
[barabasi.com/networksciencebook/](http://barabasi.com/networksciencebook/)

Análise das redes dos filmes de Star Wars  
<http://evelinag.com/blog/2015/12-15-star-wars-social-network/index.html>

A first Course in network science (Livro)  
<https://cambridgeuniversitypress.github.io/FirstCourseNetworkScience/>