

Concentric Network Symmetry

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About me

Postdoctoral fellow 2015 - now

Computational Physics

São Carlos Institute of Physics Brazil

Advisor: Prof. Luciano da F. Costa

Visiting Scholar 2017 - now

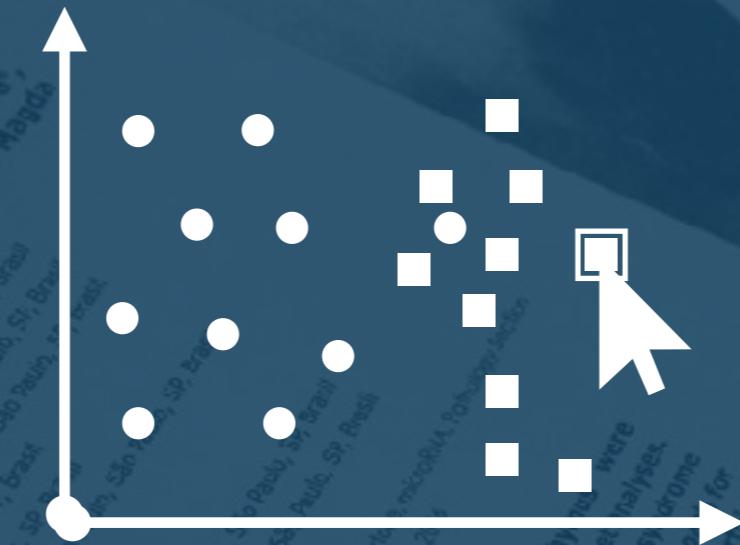
Indiana University

Advisor: Prof. Filippo Menczer

My research



Complex networks



Interactive visualization



Data analysis

My research

Science of science

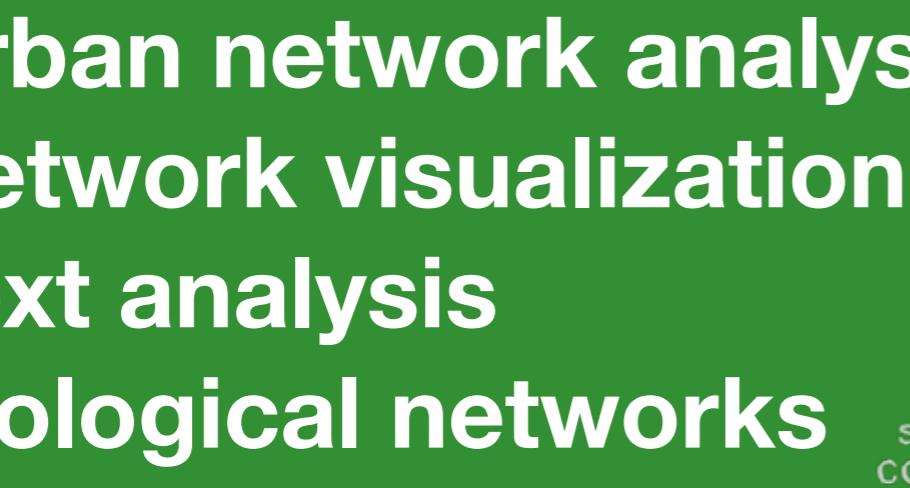
Urban network analysis

Network visualization

Text analysis

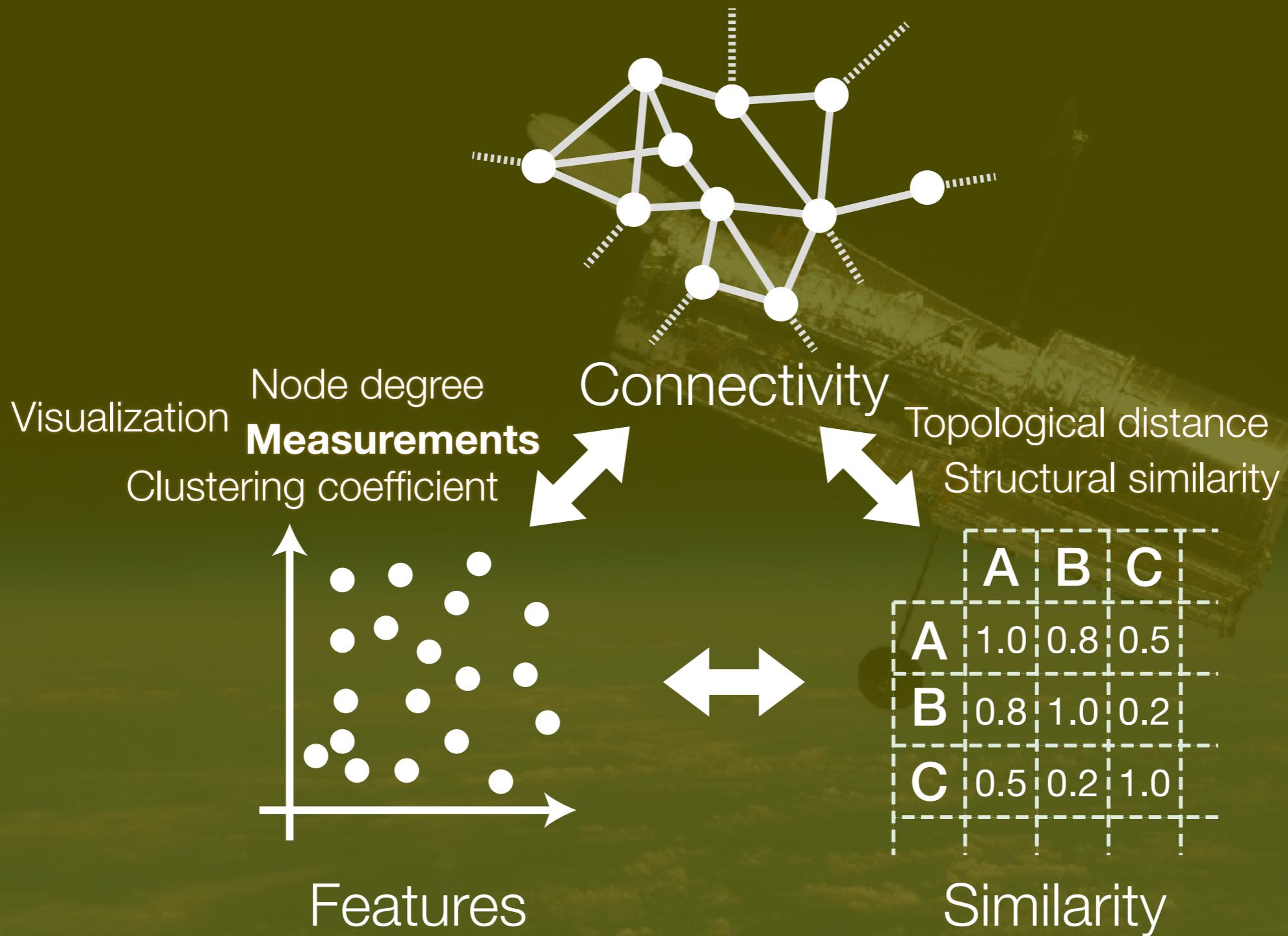
Biological networks

Transistors



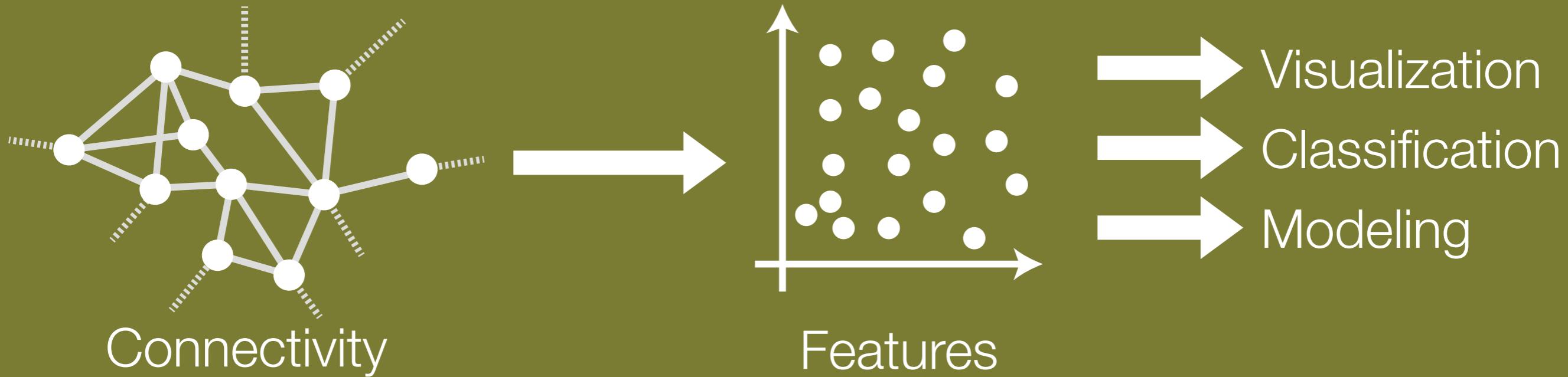


Representing and modeling complex systems



Representing and modeling complex systems

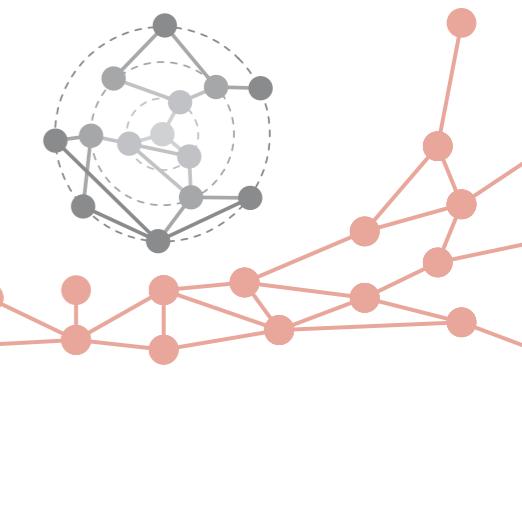
Informative features for nodes?



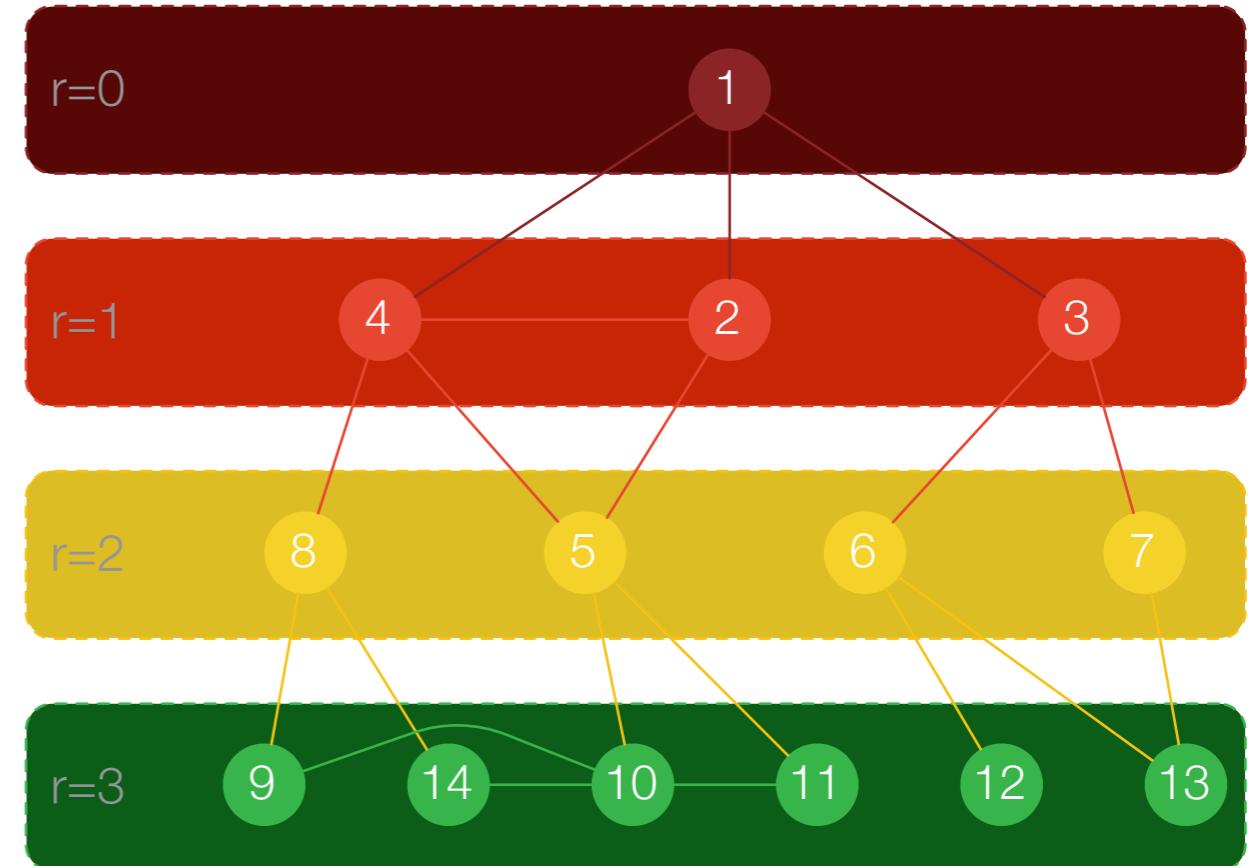
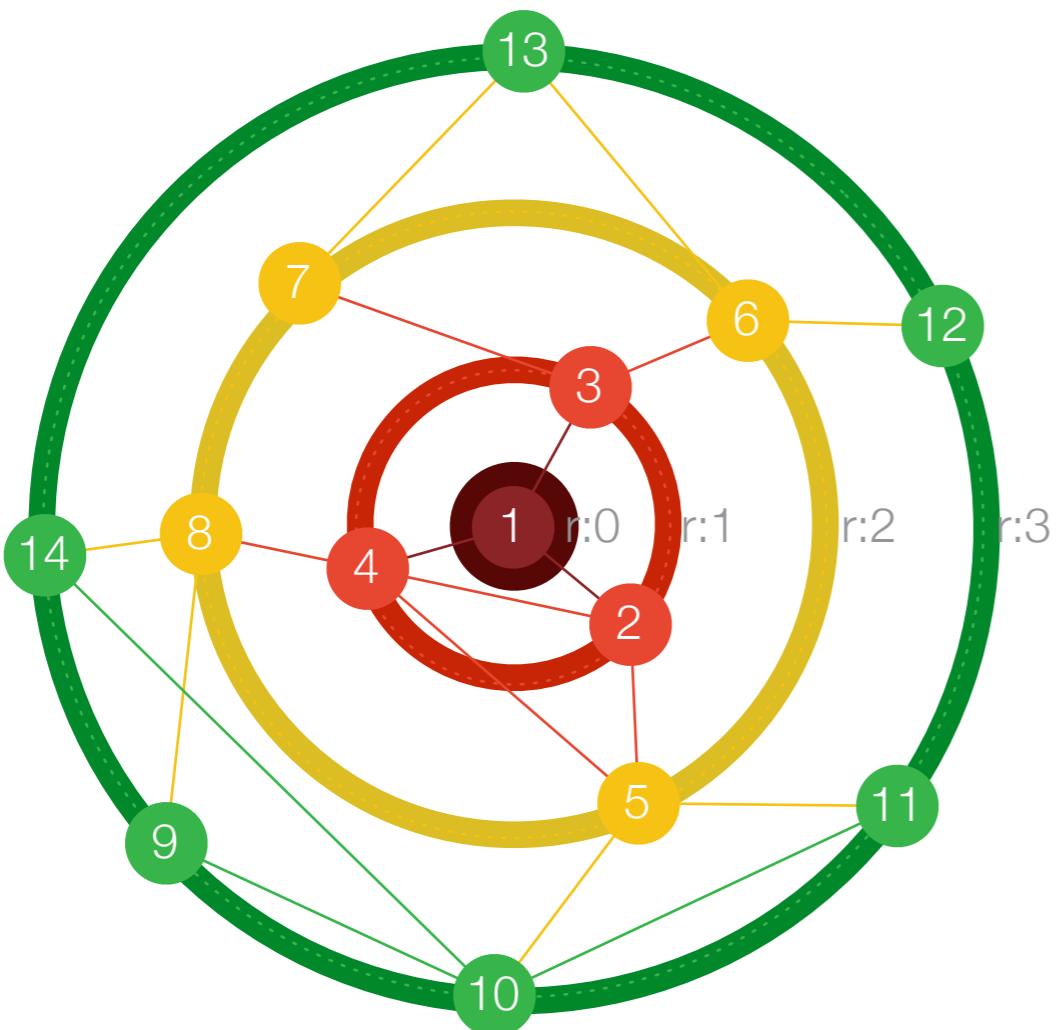
Global vs local measurements

Dependence with the size of networks is not desirable

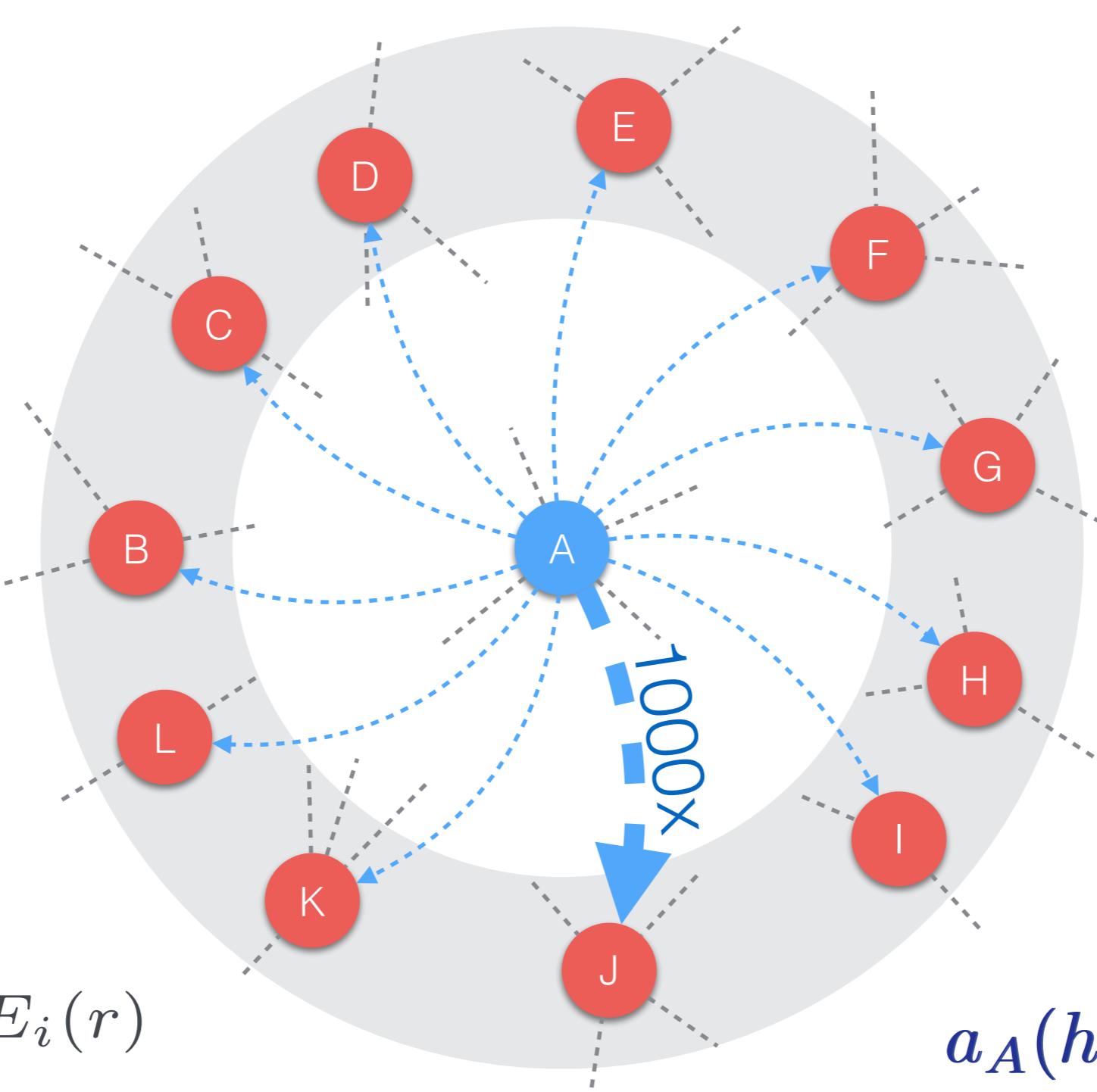
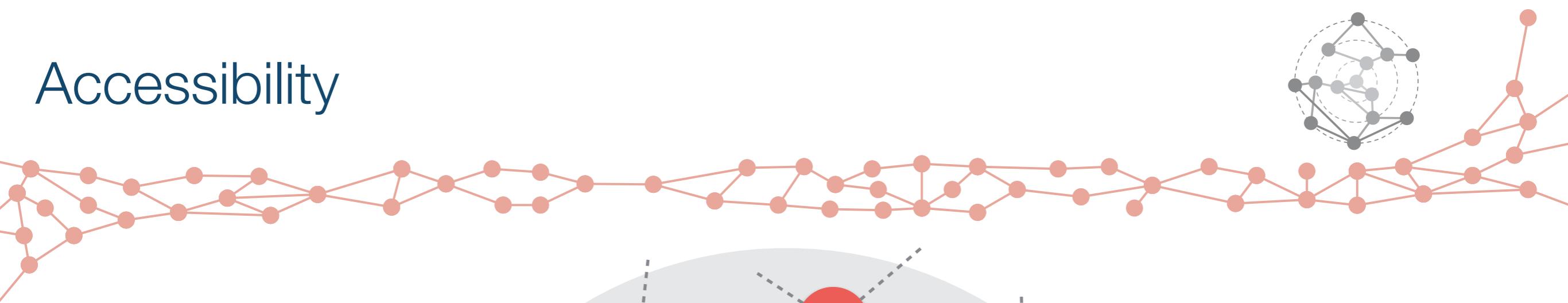
Concentric levels and properties



Balance between local and global measurements



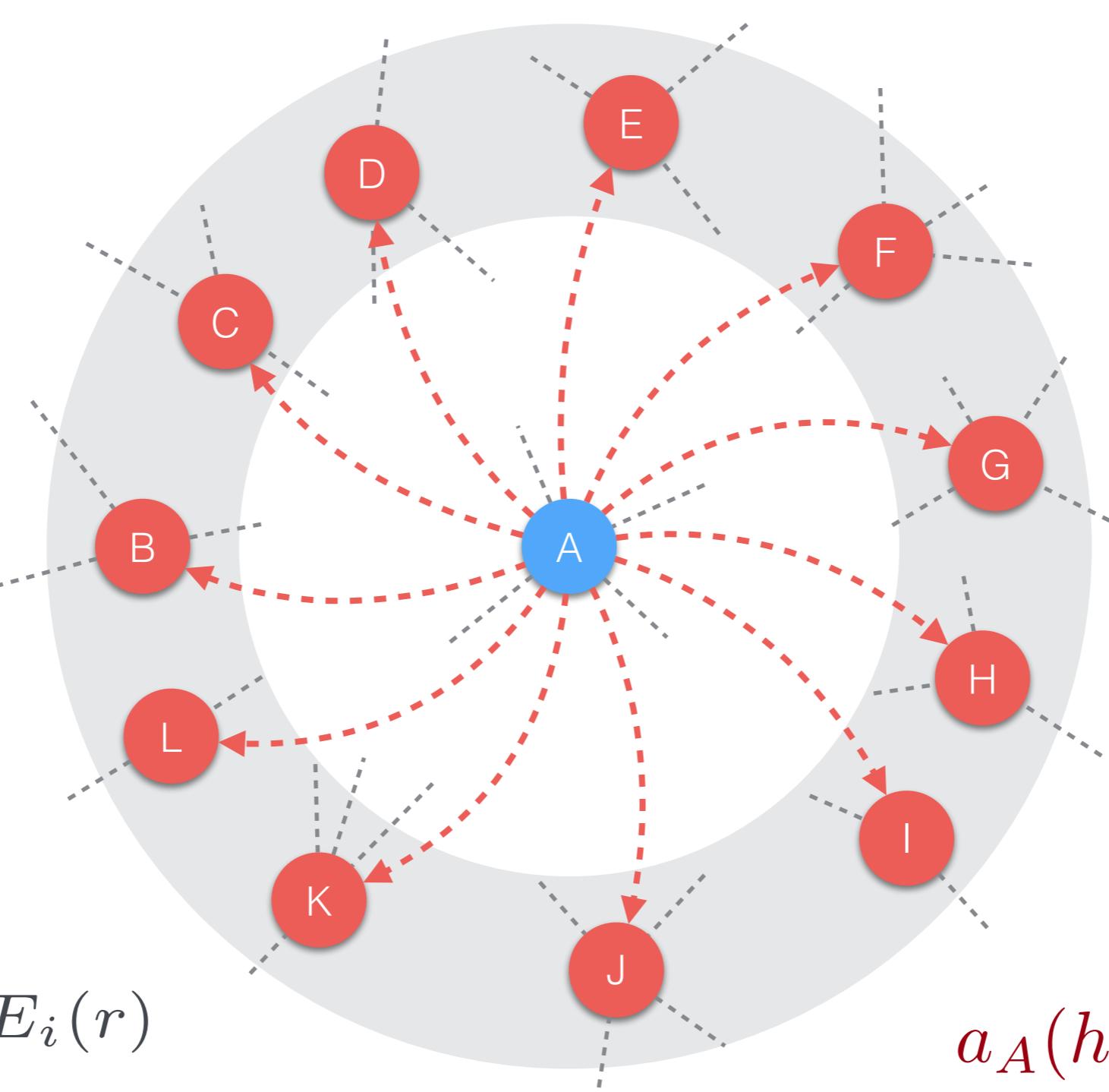
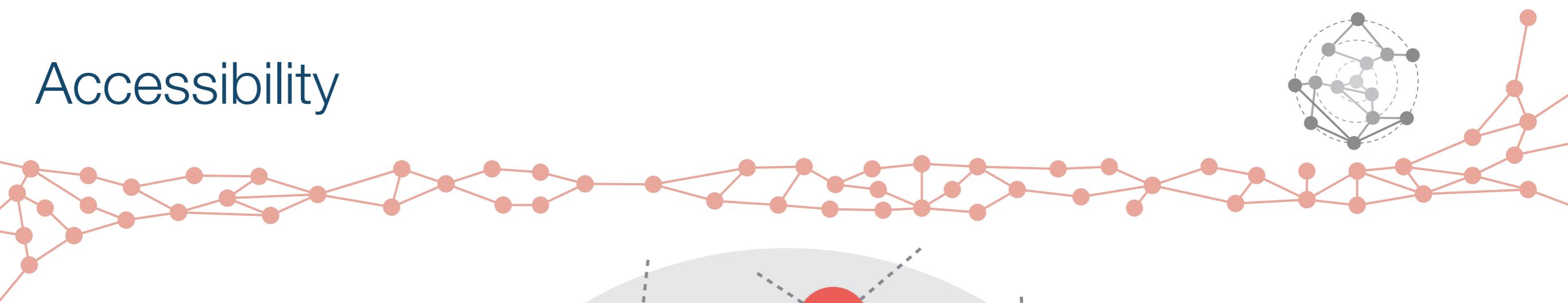
Accessibility



$$a_i(r) = e^{E_i(r)}$$

$$a_A(h) \approx 1.12$$

Accessibility



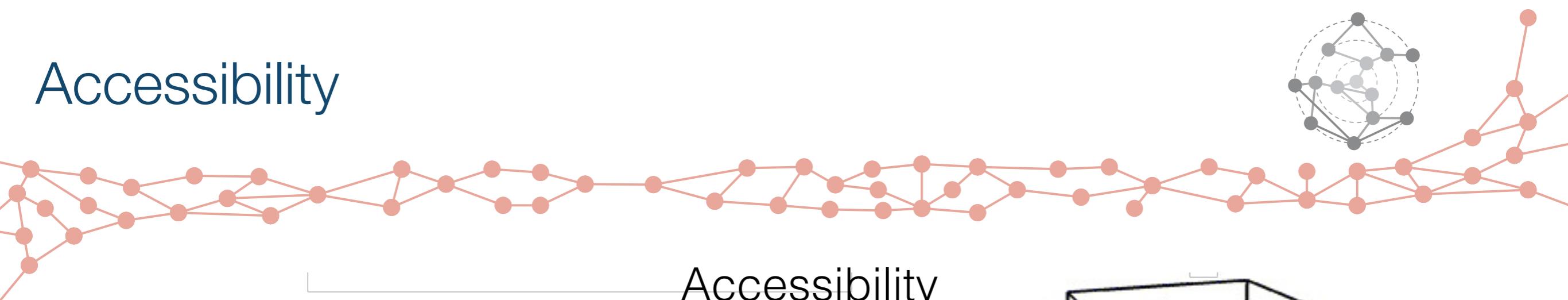
$$a_i(r) = e^{E_i(r)}$$

$$a_A(h) = 11$$

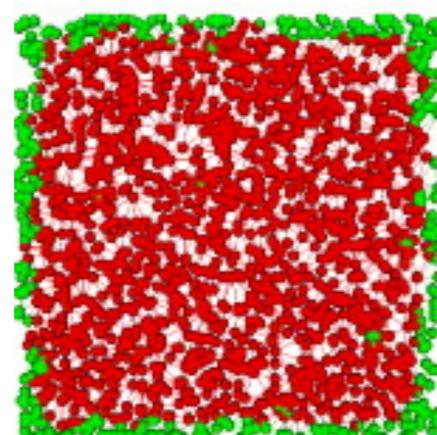
Viana, M. P.; Batista, J. a. L. B. and Costa, L. da F.

Effective number of accessed nodes in complex networks. *Phys. Rev. E*, v. 85, p. 036105, 2012.

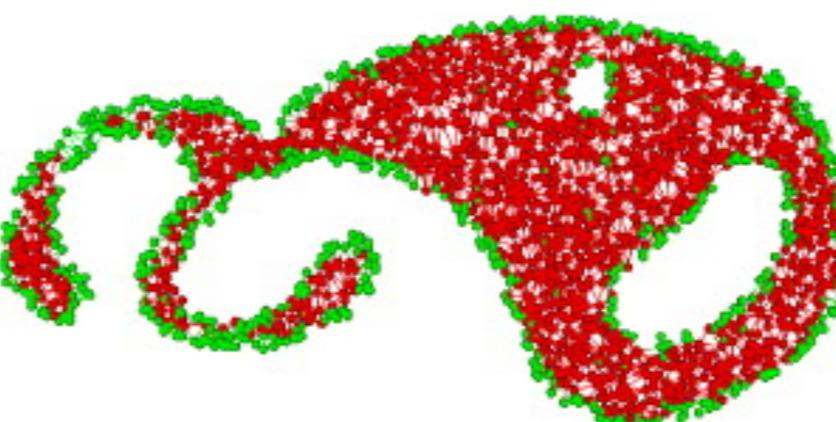
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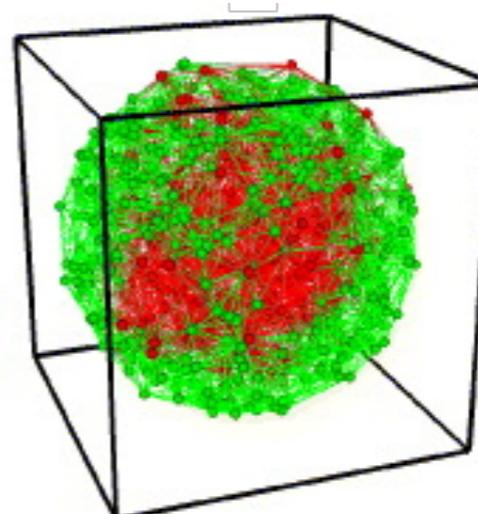
Accessibility



(d)

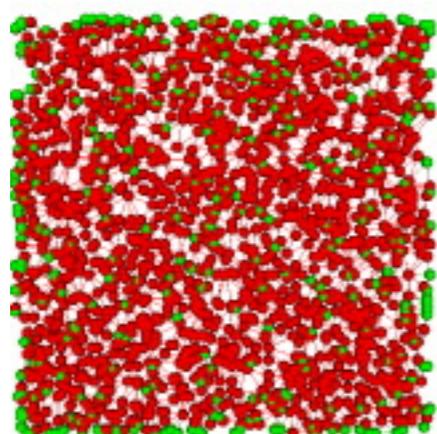


(e)

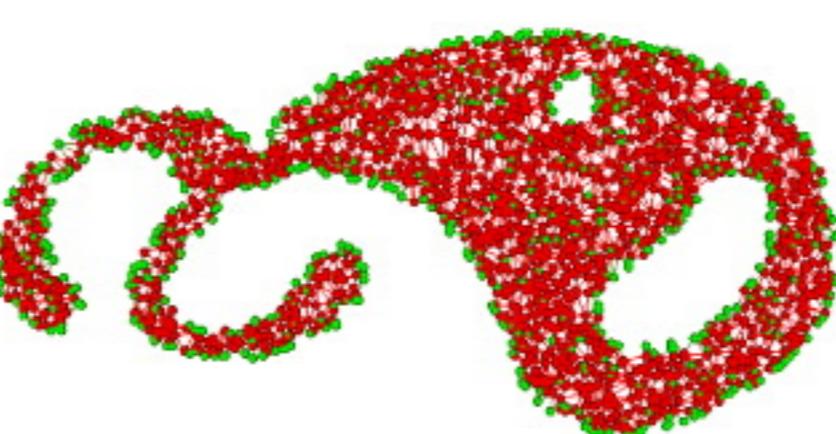


(f)

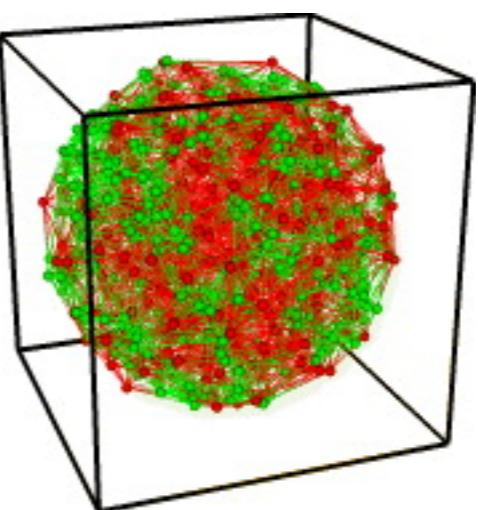
Node degree



(a)



(b)



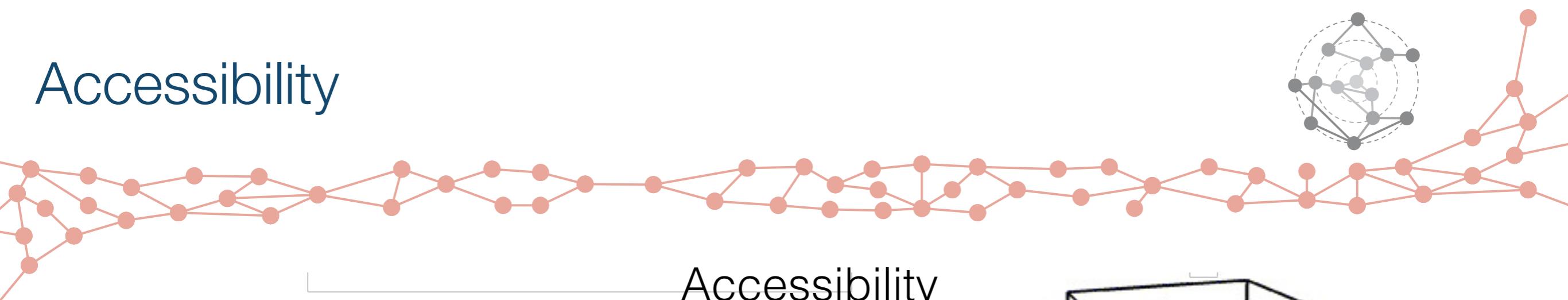
(c)

Good to detect borders on geographic networks

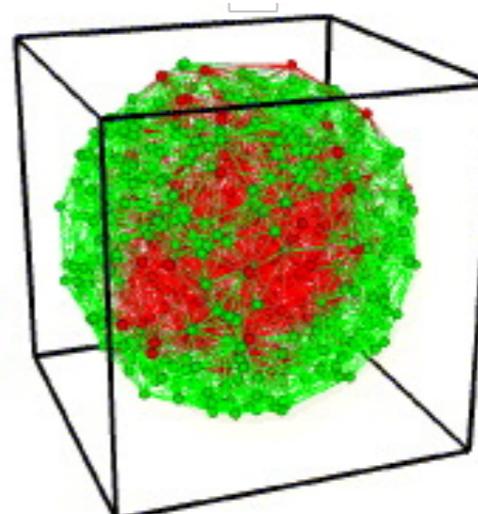
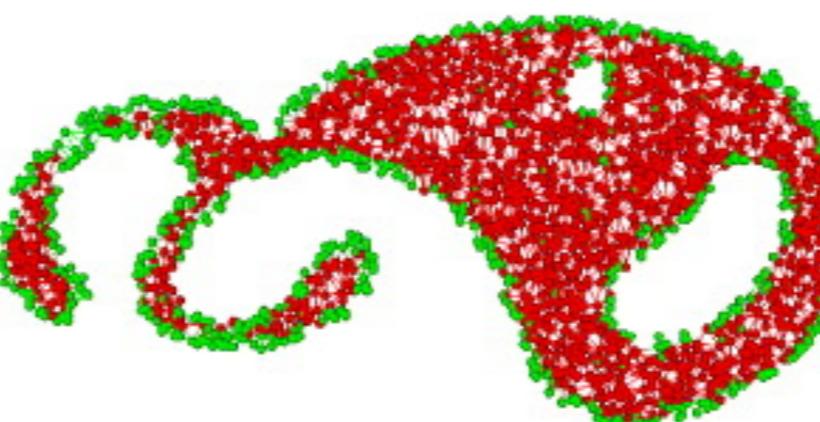
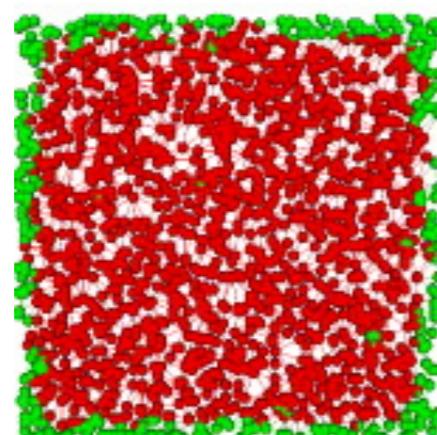
Figures from:

Travençolo, B. A., Viana, M. P., & da Fontoura Costa, L. (2009)
Border detection in complex networks. *New Journal of Physics*, 11(6), 063019.

Accessibility



Accessibility

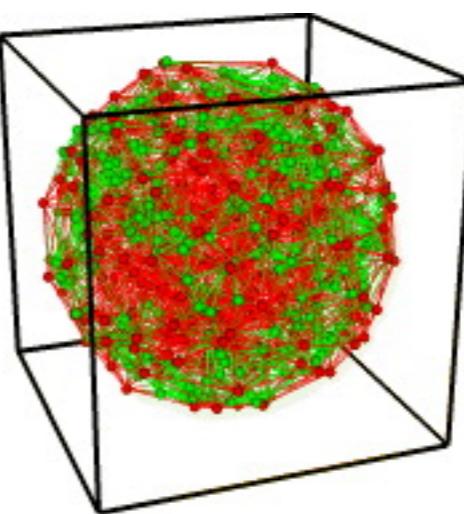
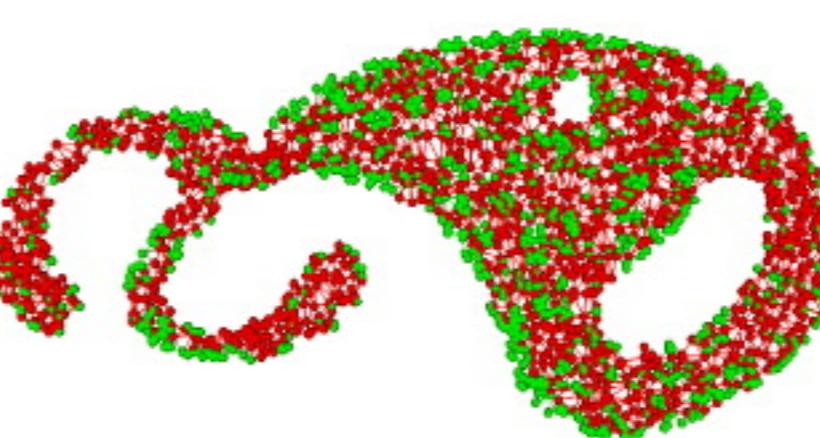
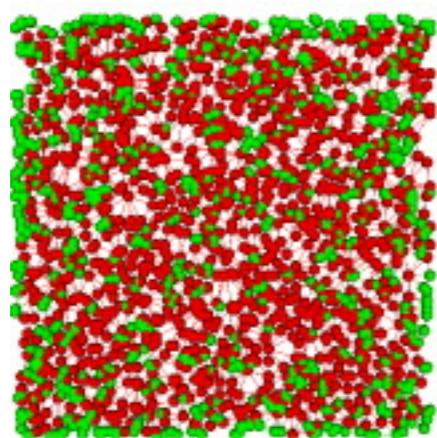


(d)

(e)

(f)

Betweenness Centrality



(a)

(b)

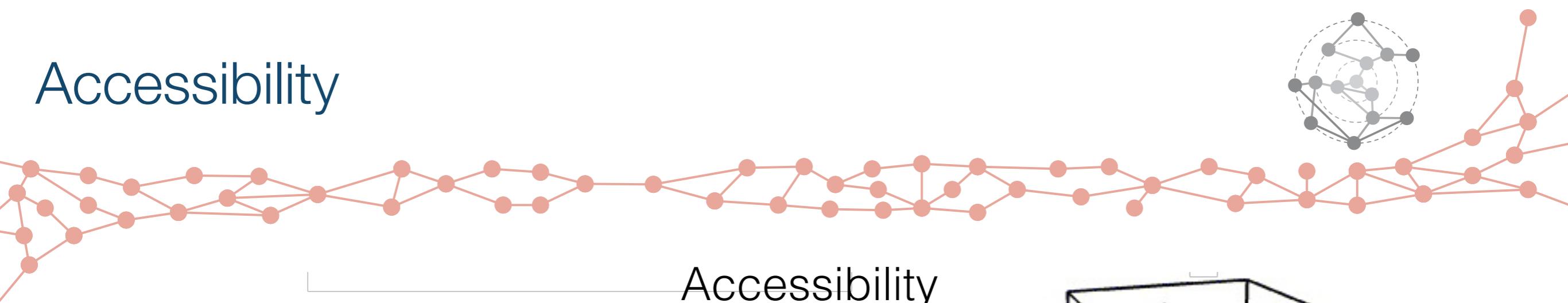
(c)

Good to detect borders on geographic networks

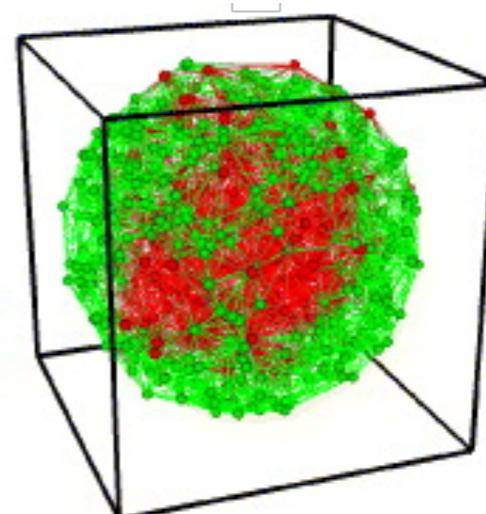
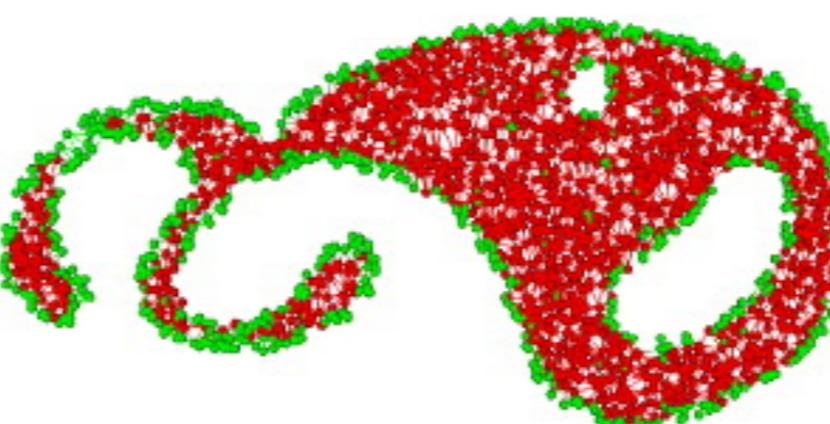
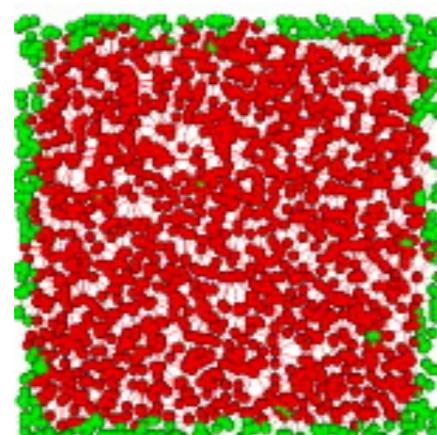
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Border detection in complex networks. *New Journal of Physics*, 11(6), 063019.

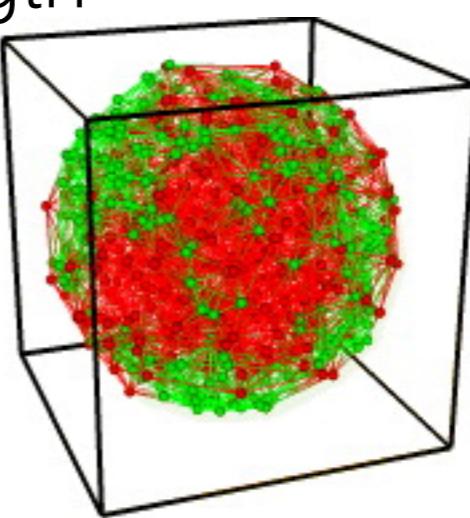
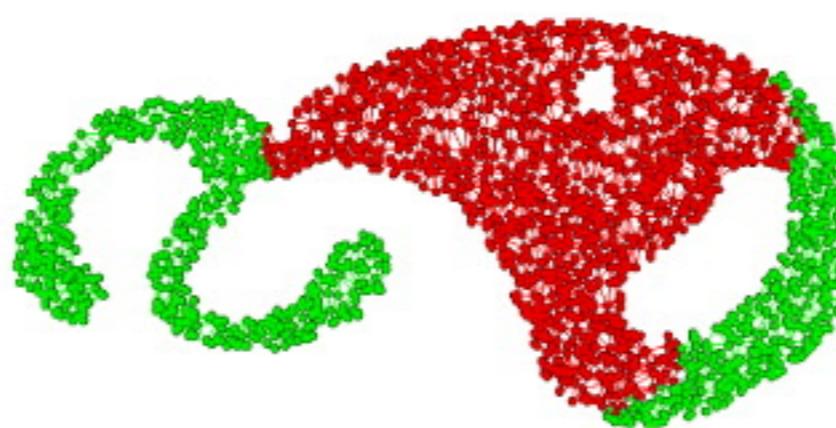
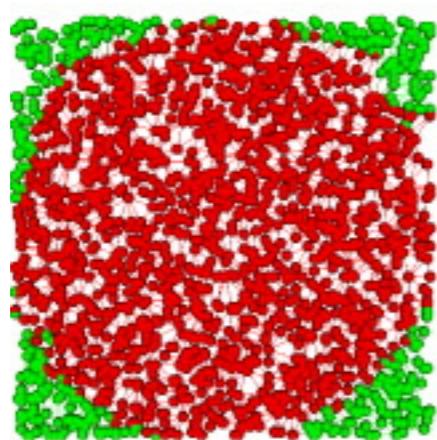
Accessibility



Accessibility



Average shortest path length

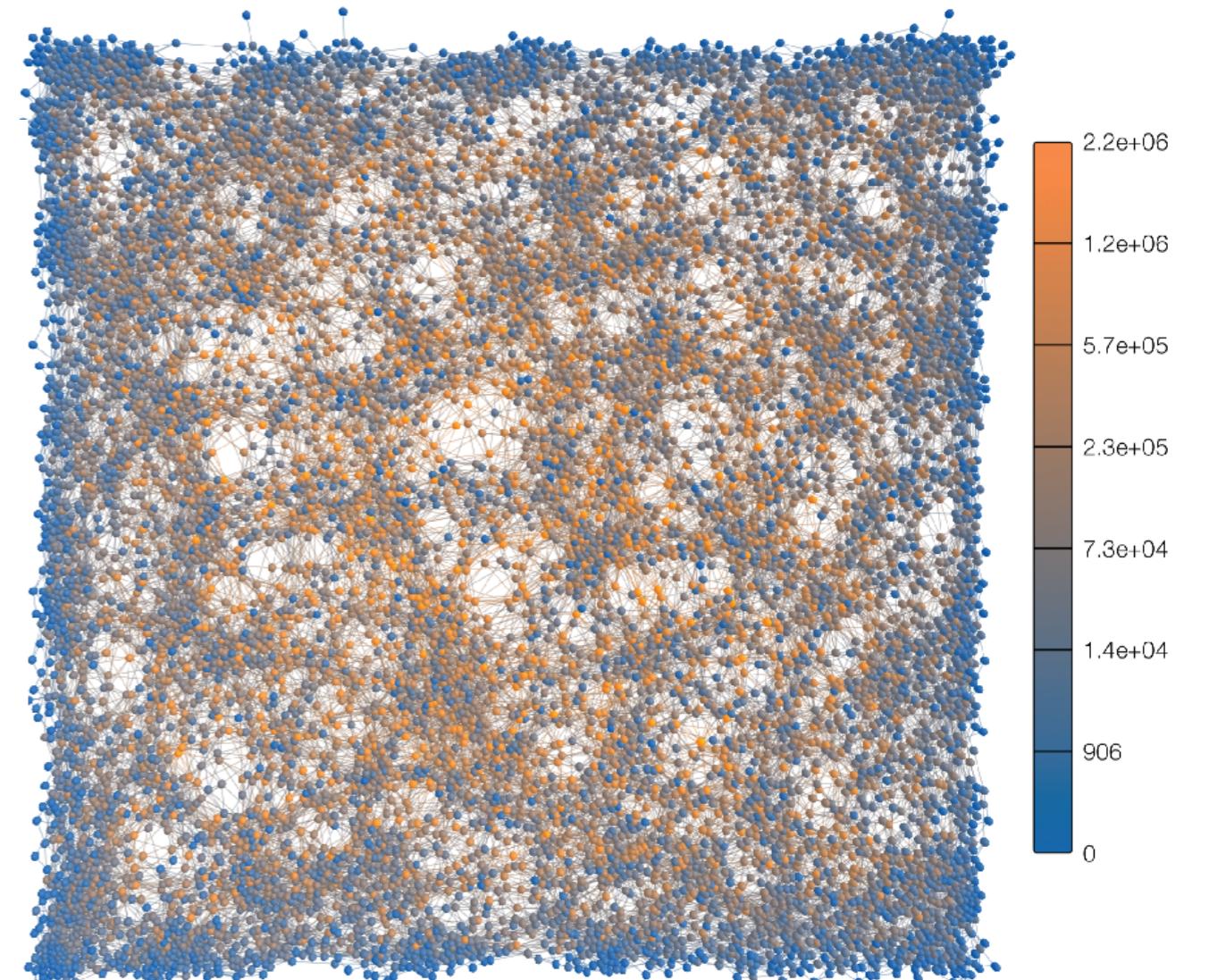
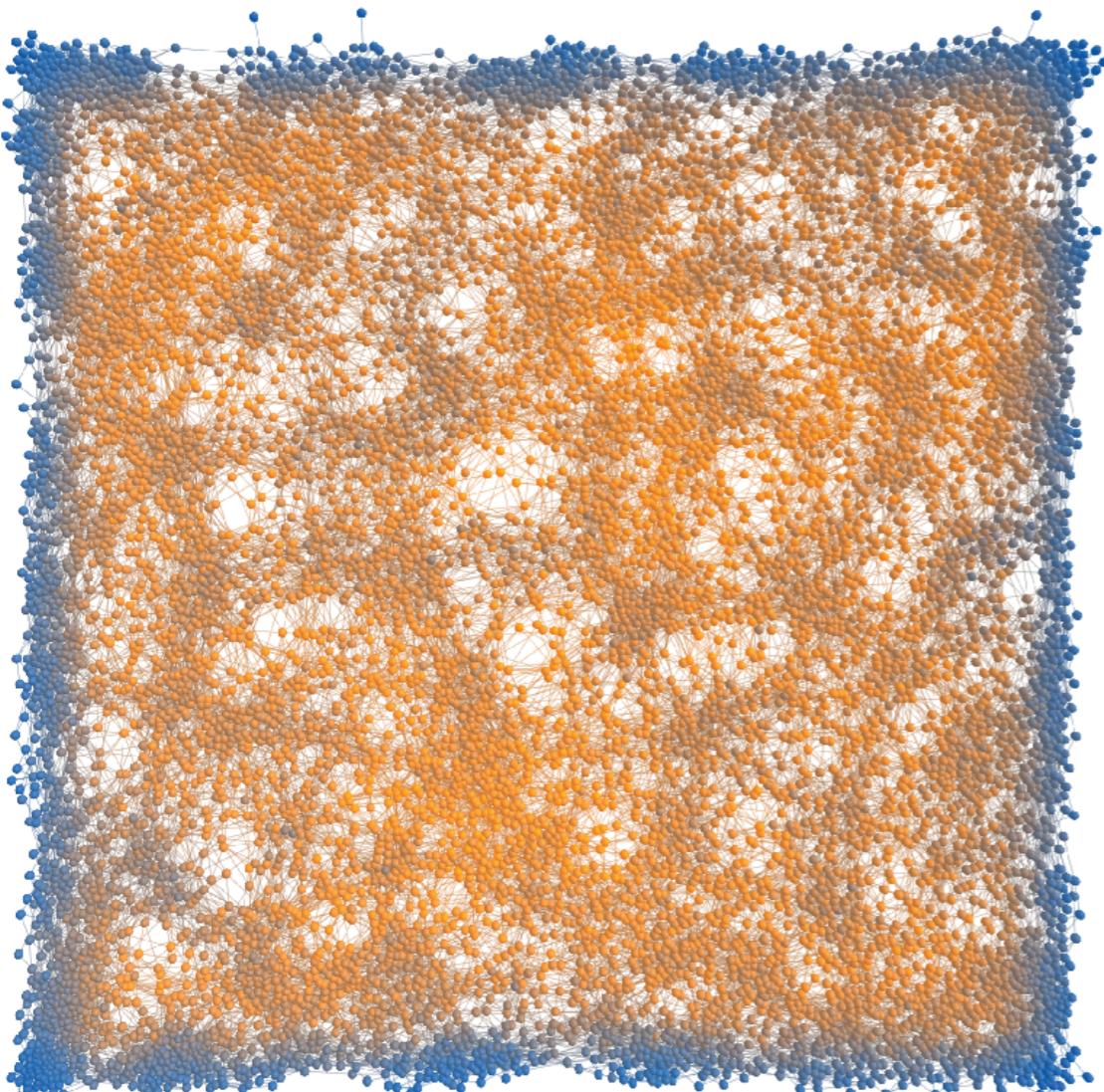
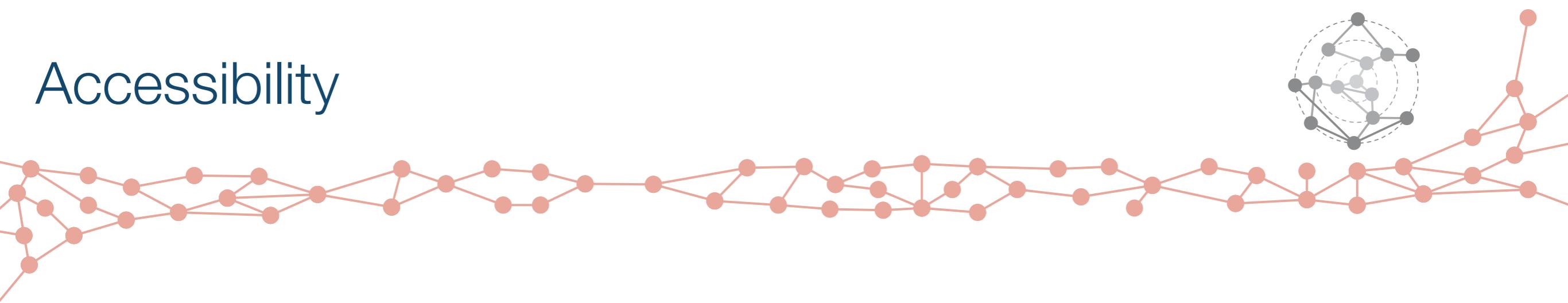


Good to detect borders on geographic networks

Figures from:

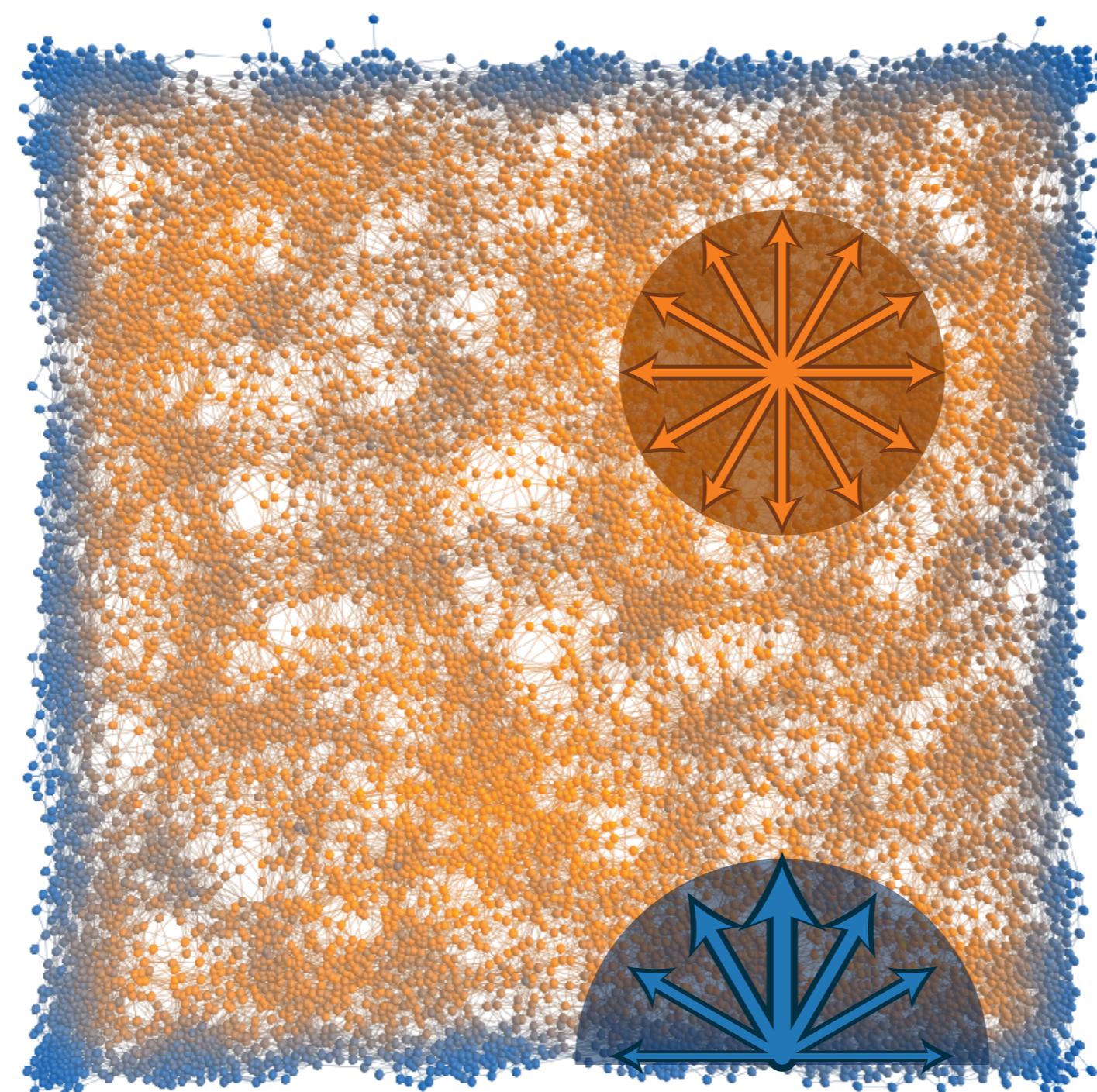
Travençolo, B. A., Viana, M. P., & da Fontoura Costa, L. (2009)
Border detection in complex networks. *New Journal of Physics*, 11(6), 063019.

Accessibility

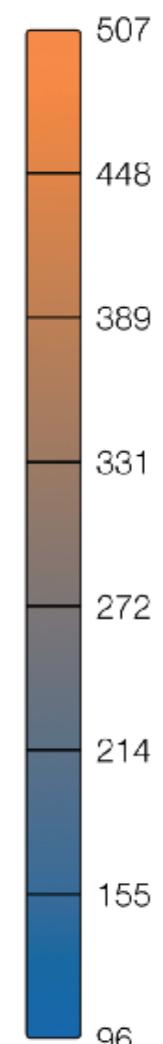


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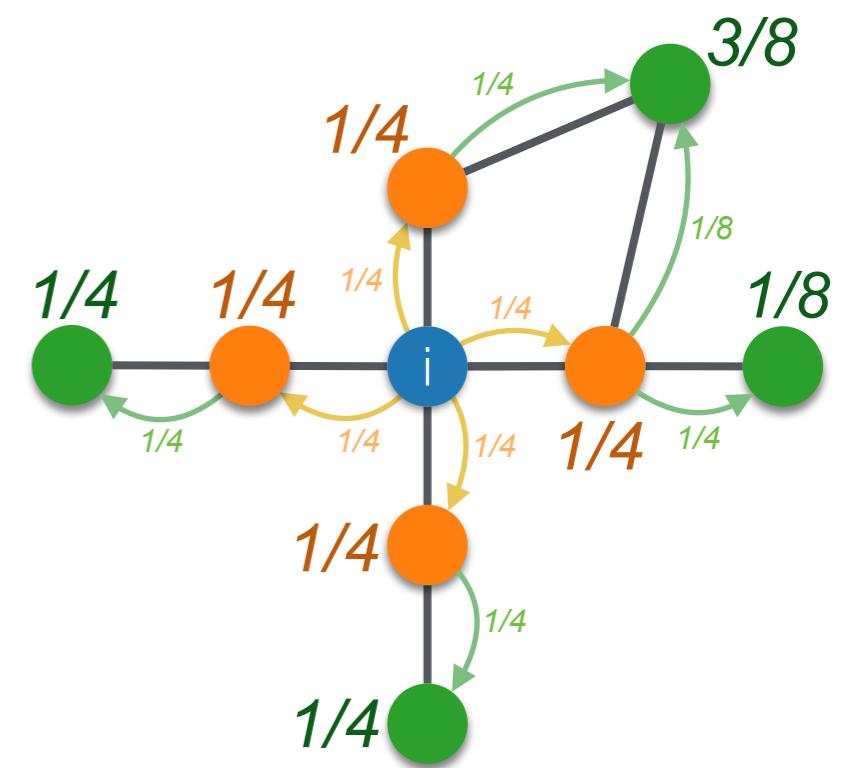
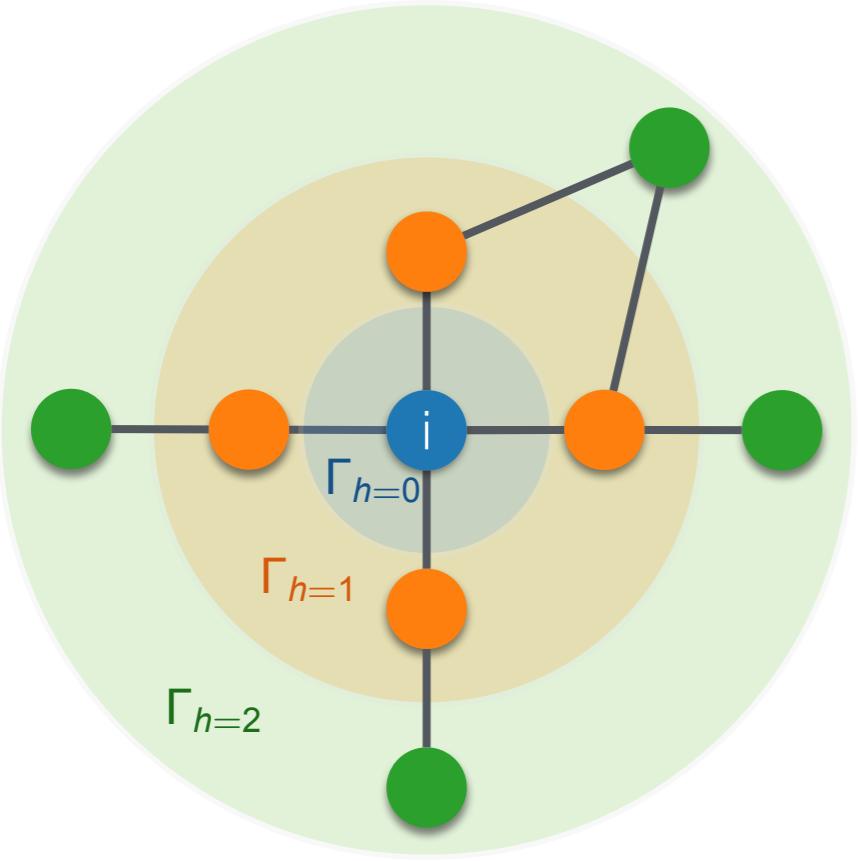
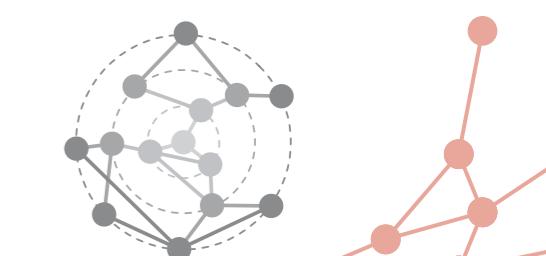
Accessibility



Accessibility ($r=3$)



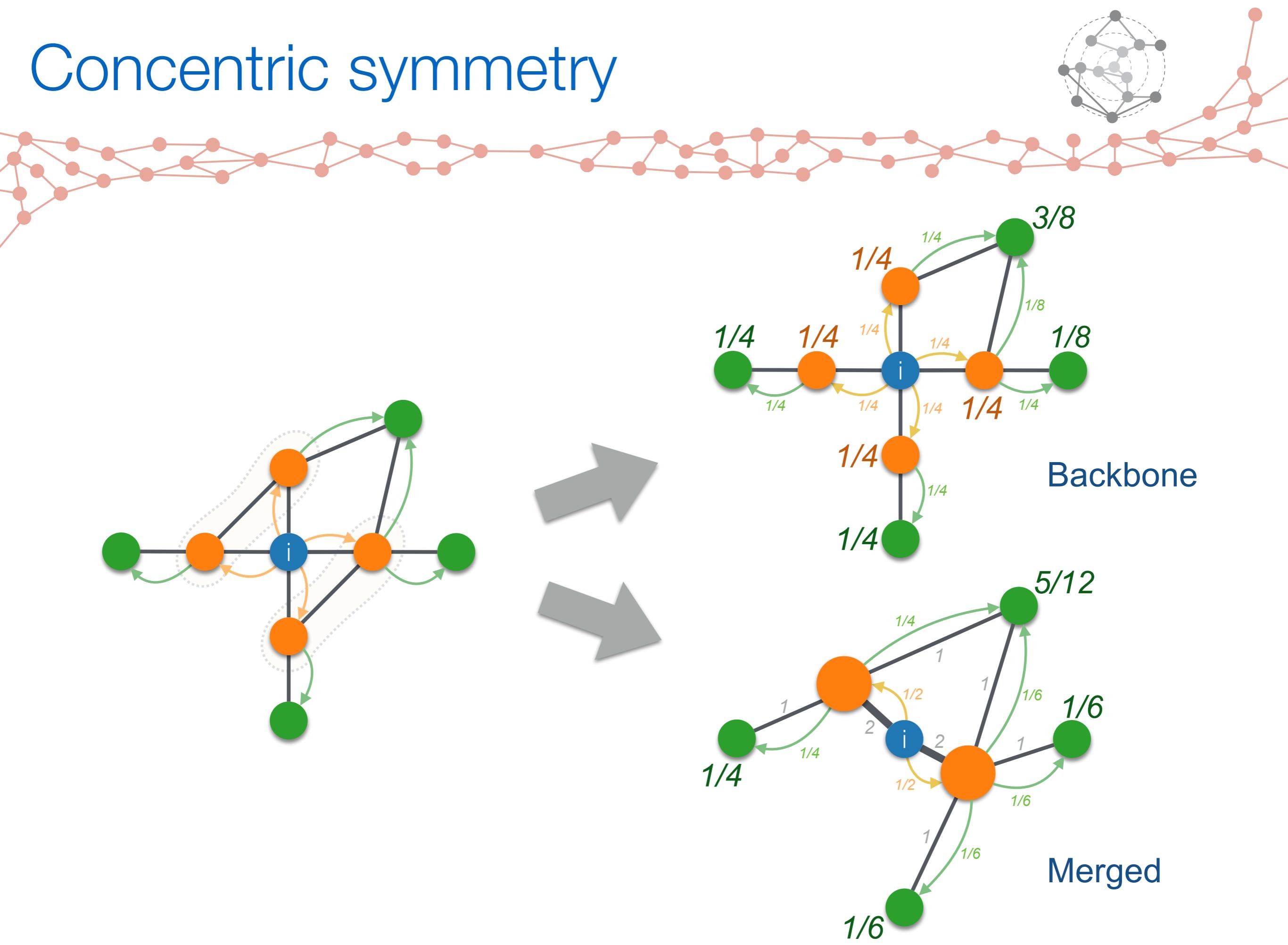
Concentric symmetry



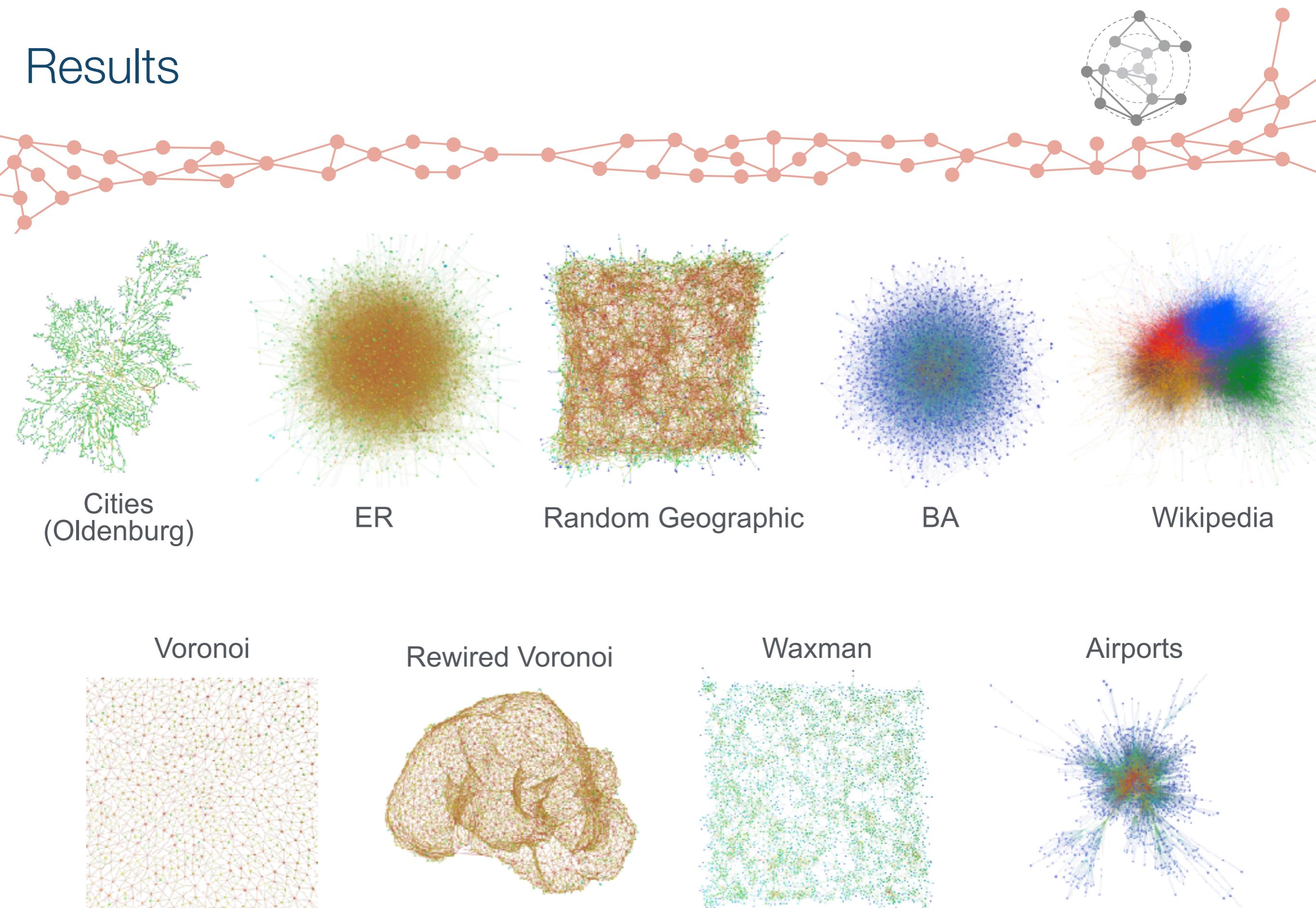
$$H_{h=3}(i) = \sum_{j \in \Gamma_{h=2}} P(i \rightarrow j) \ln(P(i \rightarrow j))$$

$$S_{h=3}(i) = \frac{e^{H_{h=3}(i)}}{|\Gamma_{h=2}|}$$

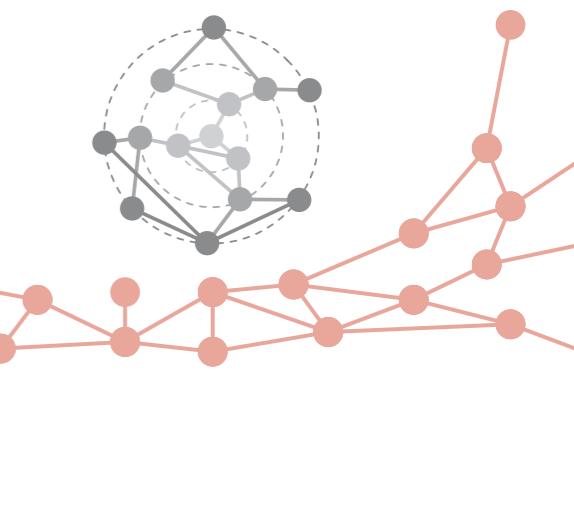
Concentric symmetry



Results



Concentric Symmetry Results



ER (similar to BA)

	0.00	0.00	-0.01	-0.00	-0.00	0.02	-0.02	-0.02	Node Degree
Clustering Coefficient	0.00	0.00	-0.01	-0.00	-0.00	0.02	-0.02	-0.02	
Node Degree	-0.04	-0.08	-0.09	-0.32	-0.16	-0.79	0.95		
Betweenness Centrality	-0.06	-0.10	-0.12	-0.36	-0.19	-0.70			
Merged Symmetry h=4	0.12	0.16	0.17	0.37	0.25				Merged Symmetry h=4
Backbone Symmetry h=4	0.82	0.81	0.95	0.91					Backbone Symmetry h=4
Merged Symmetry h=3	0.80	0.80	0.93						Merged Symmetry h=4
Backbone Symmetry h=3	0.87	0.86							Backbone Symmetry h=4
Merged Symmetry h=2	0.99								Merged Symmetry h=3
Backbone Symmetry h=2									Backbone Symmetry h=3

Waxman (similar to other GEO models)

	0.01	-0.04	-0.01	-0.05	-0.03	-0.02	0.01	0.03	Node Degree
Clustering Coefficient	0.01	-0.04	-0.01	-0.05	-0.03	-0.02	0.01	0.03	
Node Degree	-0.35	-0.64	-0.53	-0.36	-0.52	-0.18	0.29		
Betweenness Centrality	-0.06	-0.16	-0.12	-0.16	-0.14	-0.13			
Merged Symmetry h=4	0.07	0.21	0.12	0.35	0.13				Merged Symmetry h=4
Backbone Symmetry h=4	0.44	0.53	0.72	0.35					Backbone Symmetry h=4
Merged Symmetry h=3	0.11	0.42	0.18						Merged Symmetry h=4
Backbone Symmetry h=3	0.65	0.50							Backbone Symmetry h=4
Merged Symmetry h=2	0.30								Merged Symmetry h=3
Backbone Symmetry h=2									Backbone Symmetry h=3

Concentric Symmetry Results



San Joaquin (matrix similar to Oldenburg)

	0.01	0.02	0.00	0.01	-0.00	-0.02	0.10	0.03
Clustering Coefficient	0.01	0.02	0.00	0.01	-0.00	-0.02	0.10	0.03
Node Degree	-0.35	-0.40	-0.40	-0.41	-0.38	-0.35	0.24	
Betweenness Centrality	0.08	0.07	0.07	0.06	0.04	0.02		
Merged Symmetry h=4	0.30	0.32	0.60	0.62	0.92			
Backbone Symmetry h=4	0.29	0.31	0.63	0.64				
Merged Symmetry h=3	0.53	0.54	0.95					
Backbone Symmetry h=3	0.54	0.55						
Merged Symmetry h=2	0.96							

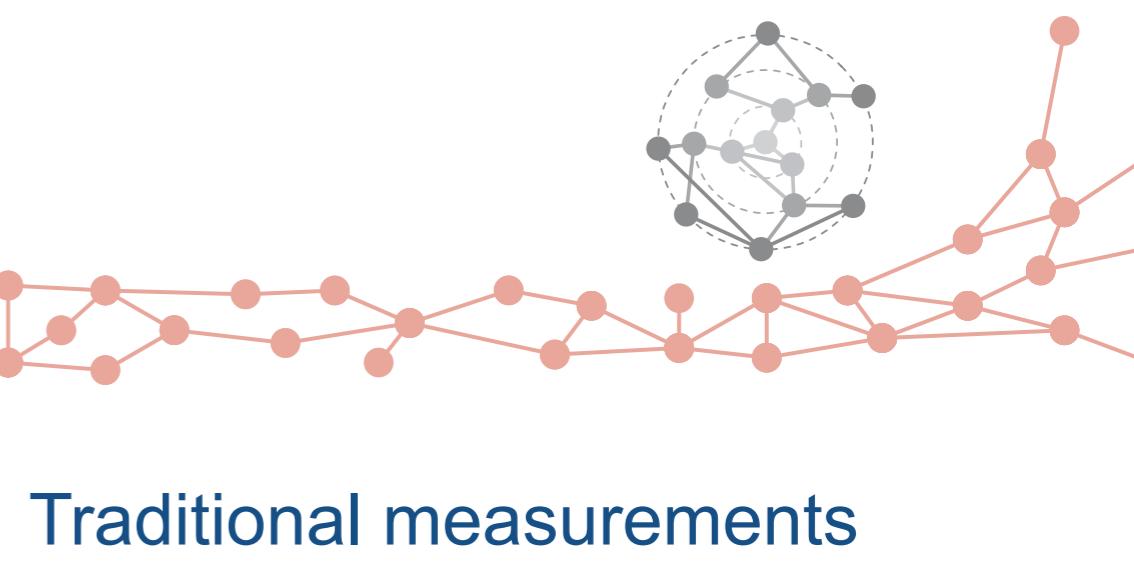
Wikipedia (matrix similar to airport)

	-0.05	-0.10	-0.05	-0.05	-0.00	-0.02	0.00	0.02
Clustering Coefficient	-0.05	-0.10	-0.05	-0.05	-0.00	-0.02	0.00	0.02
Node Degree	-0.31	-0.27	-0.16	-0.11	-0.12	0.06	0.78	
Betweenness Centrality	-0.11	-0.09	-0.05	-0.03	-0.04	0.10		
Merged Symmetry h=4	0.10	0.21	0.29	0.57	0.46			
Backbone Symmetry h=4	0.46	0.31	0.72	0.51				
Merged Symmetry h=3	0.30	0.57	0.63					
Backbone Symmetry h=3	0.65	0.63						
Merged Symmetry h=2	0.63							

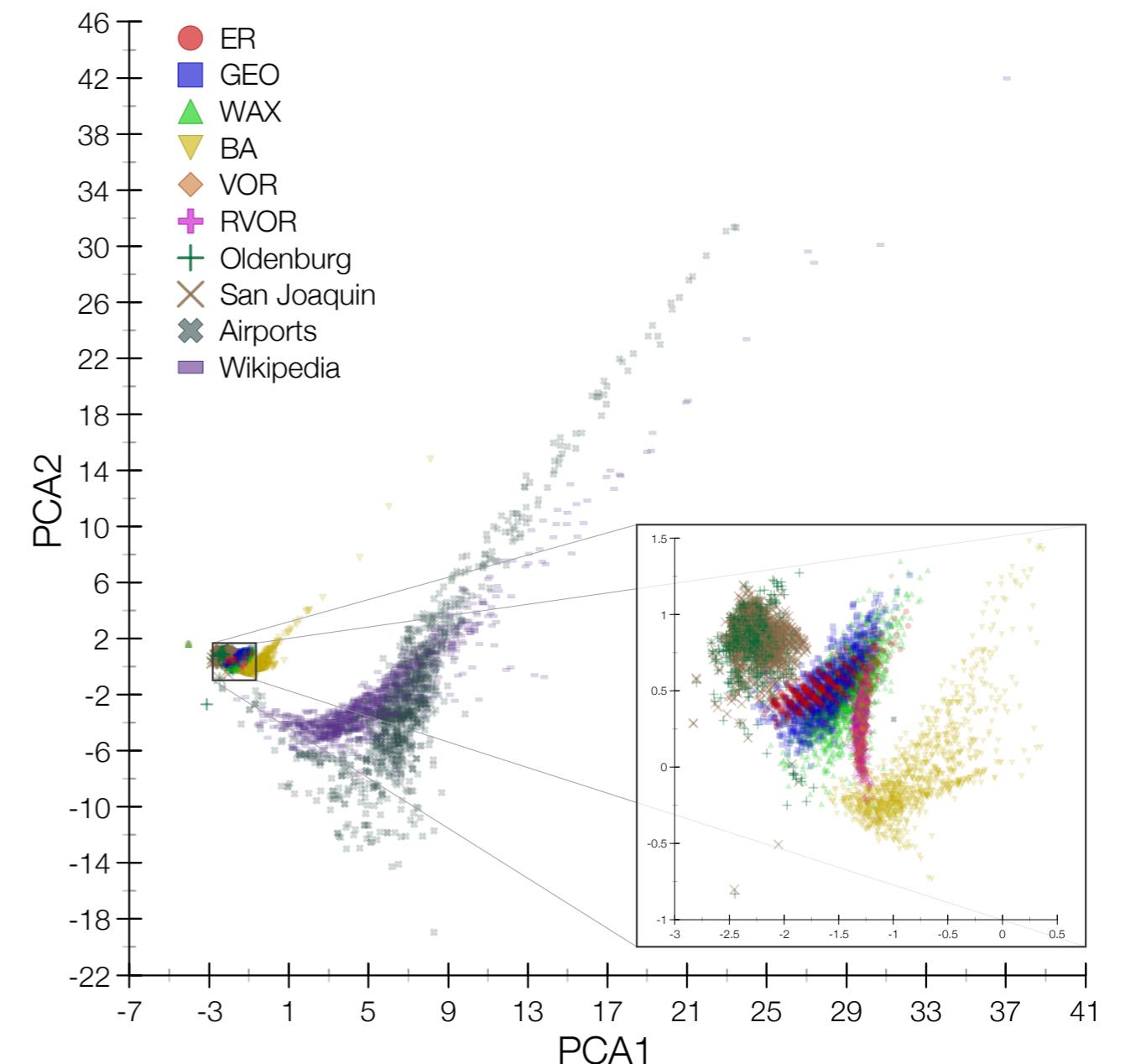
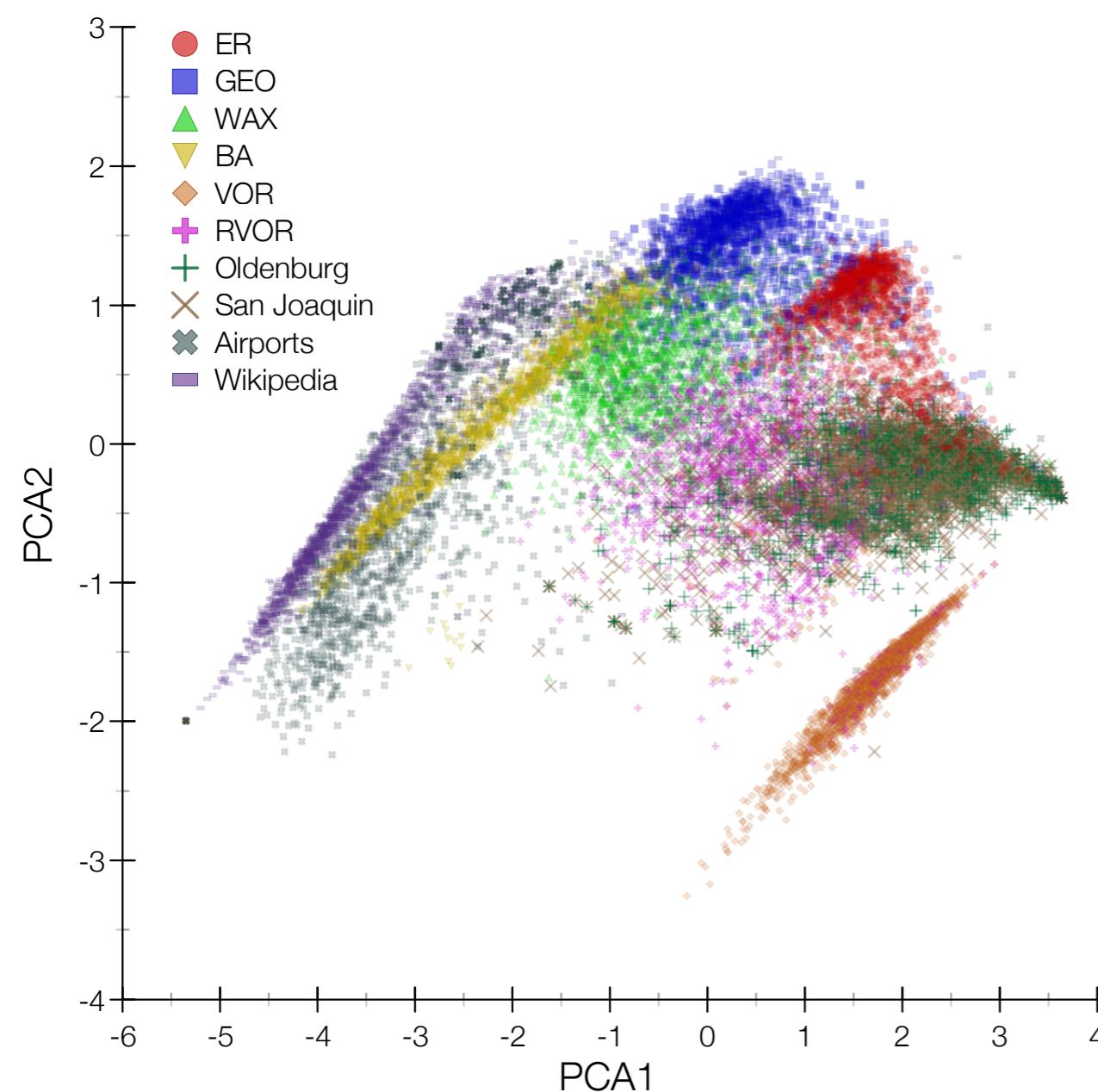
Concentric Symmetry Results



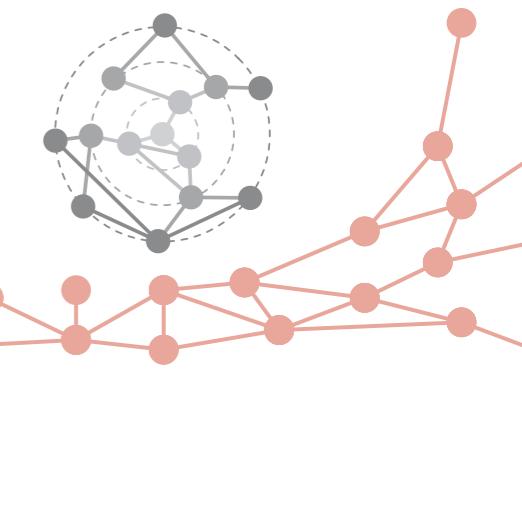
Concentric symmetry



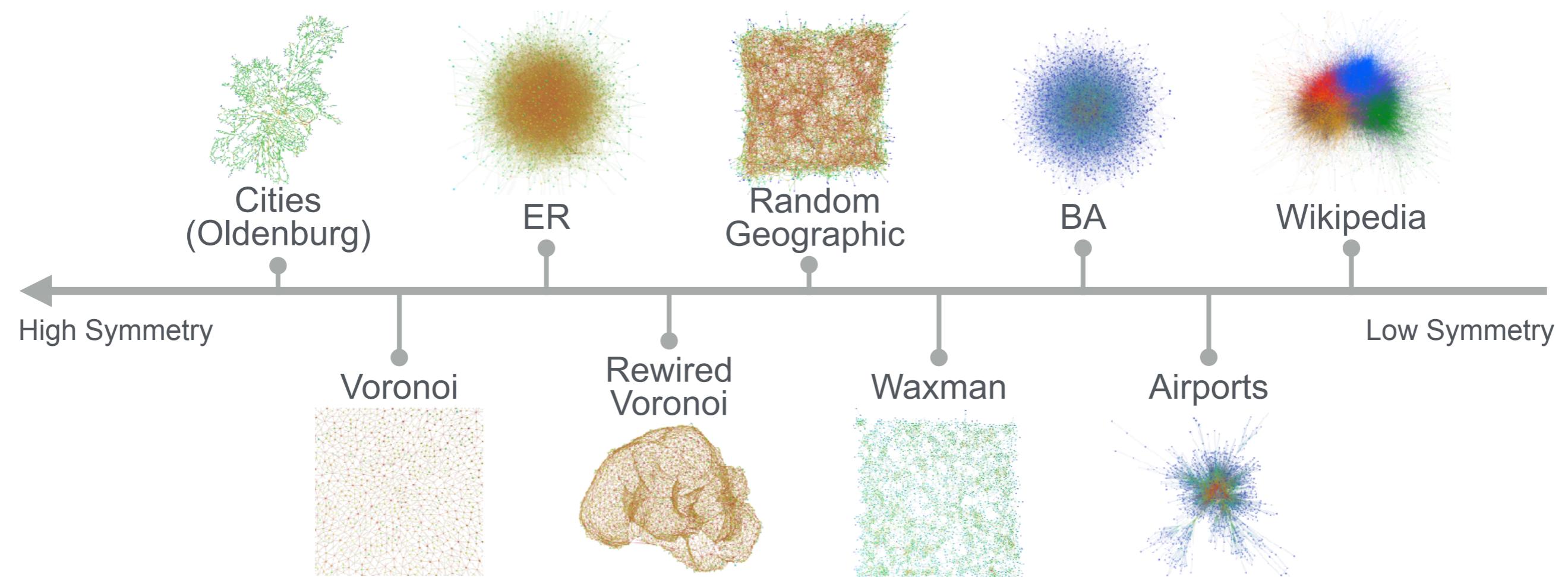
Traditional measurements



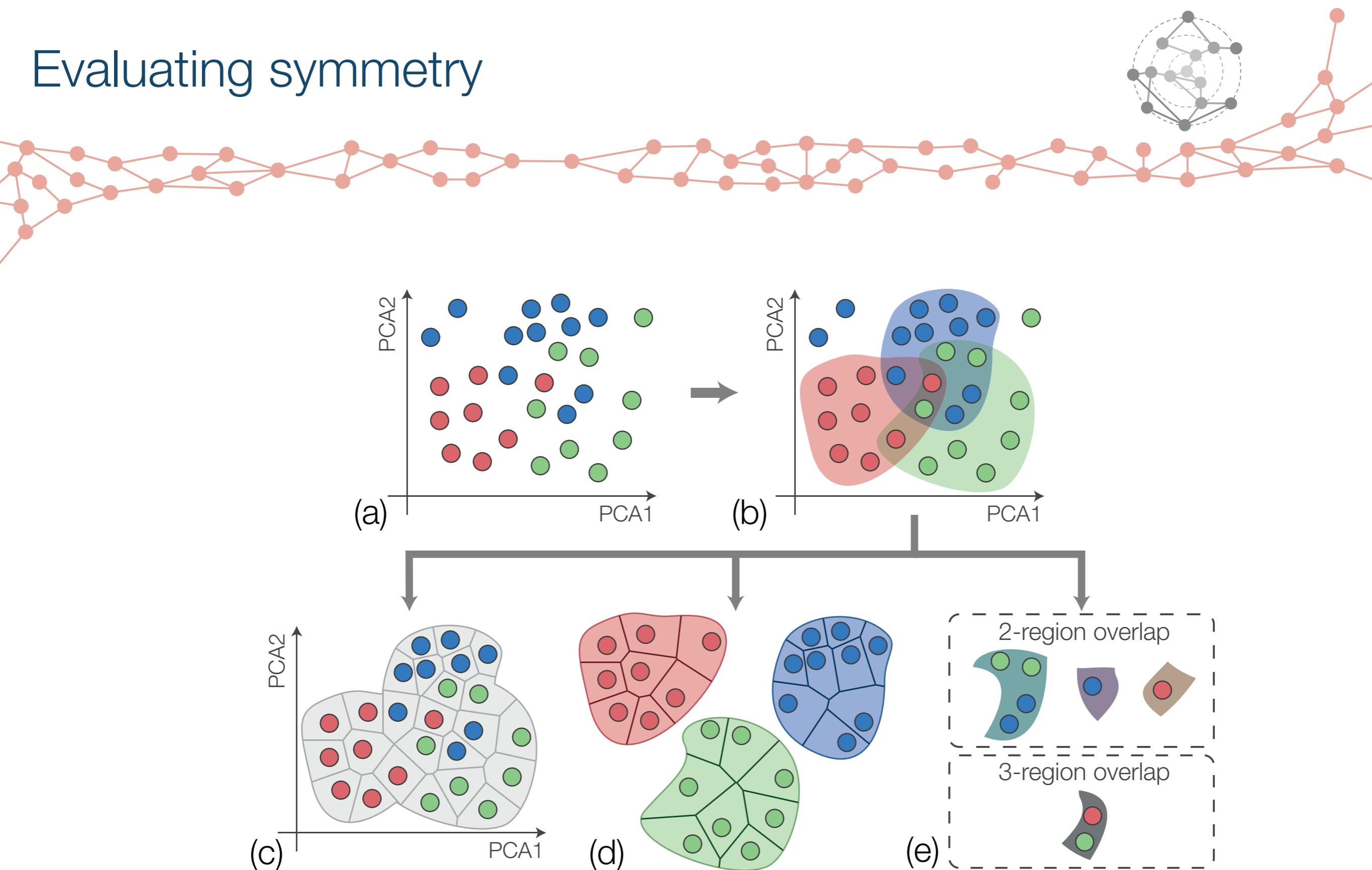
Concentric Symmetry Results



- Concentric symmetries
 - Do not correlate with traditional network measurements.
 - Discriminate between a diverse range of models and real networks.
 - Can be used to rank networks by their "average" symmetry.



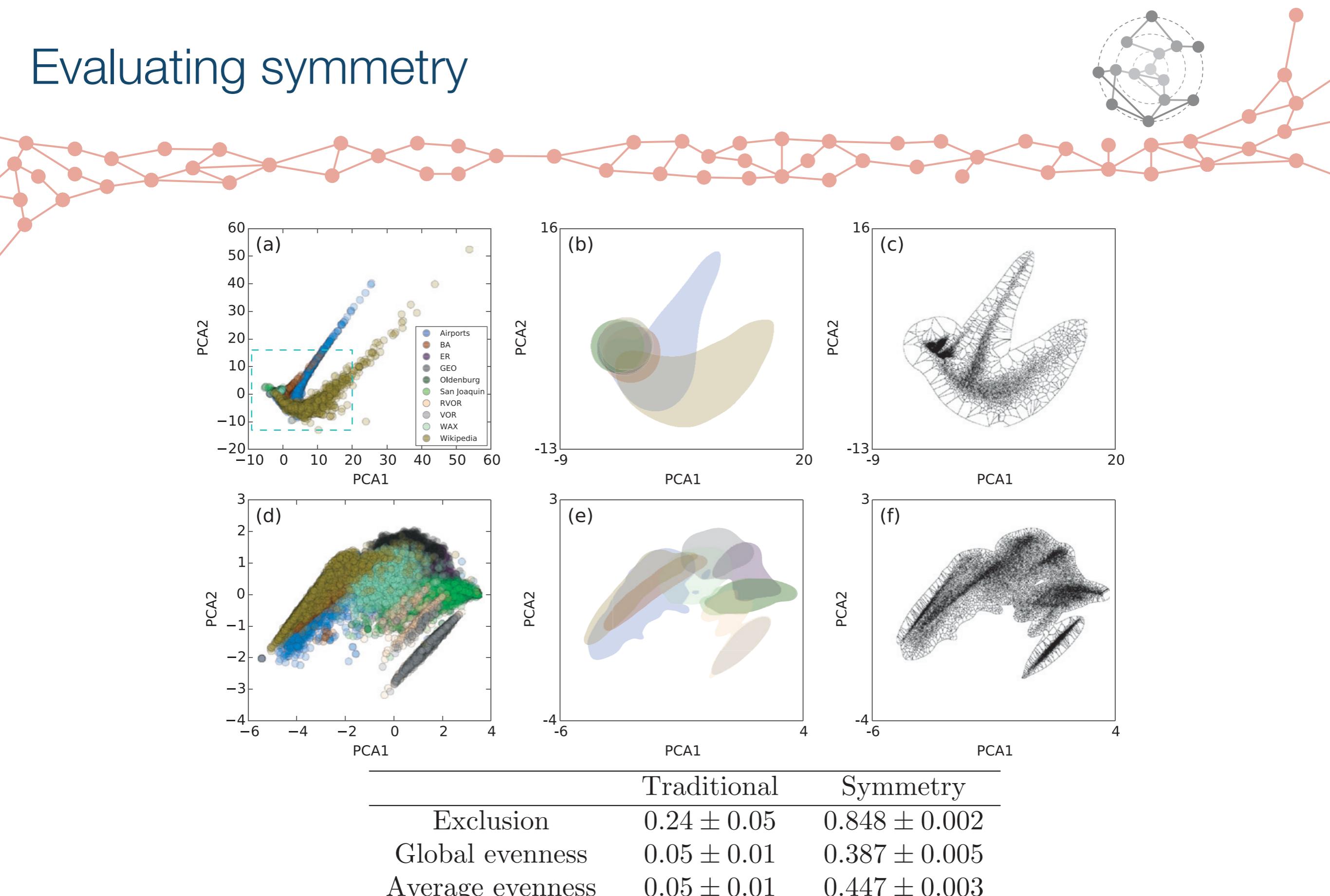
Evaluating symmetry



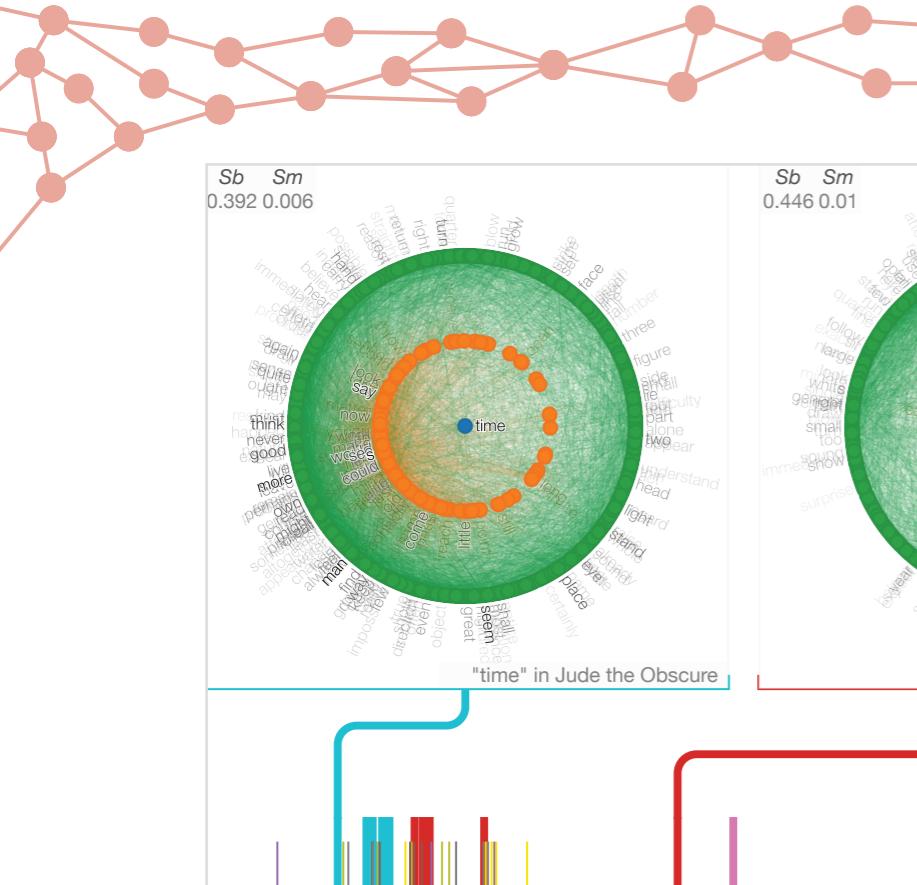
Comin, C. H., Silva, F. N., & Costa, L. D. F. (2015).

A framework for evaluating complex networks measurements. *EPL (Europhysics Letters)*, 110(6), 68002.

Evaluating symmetry



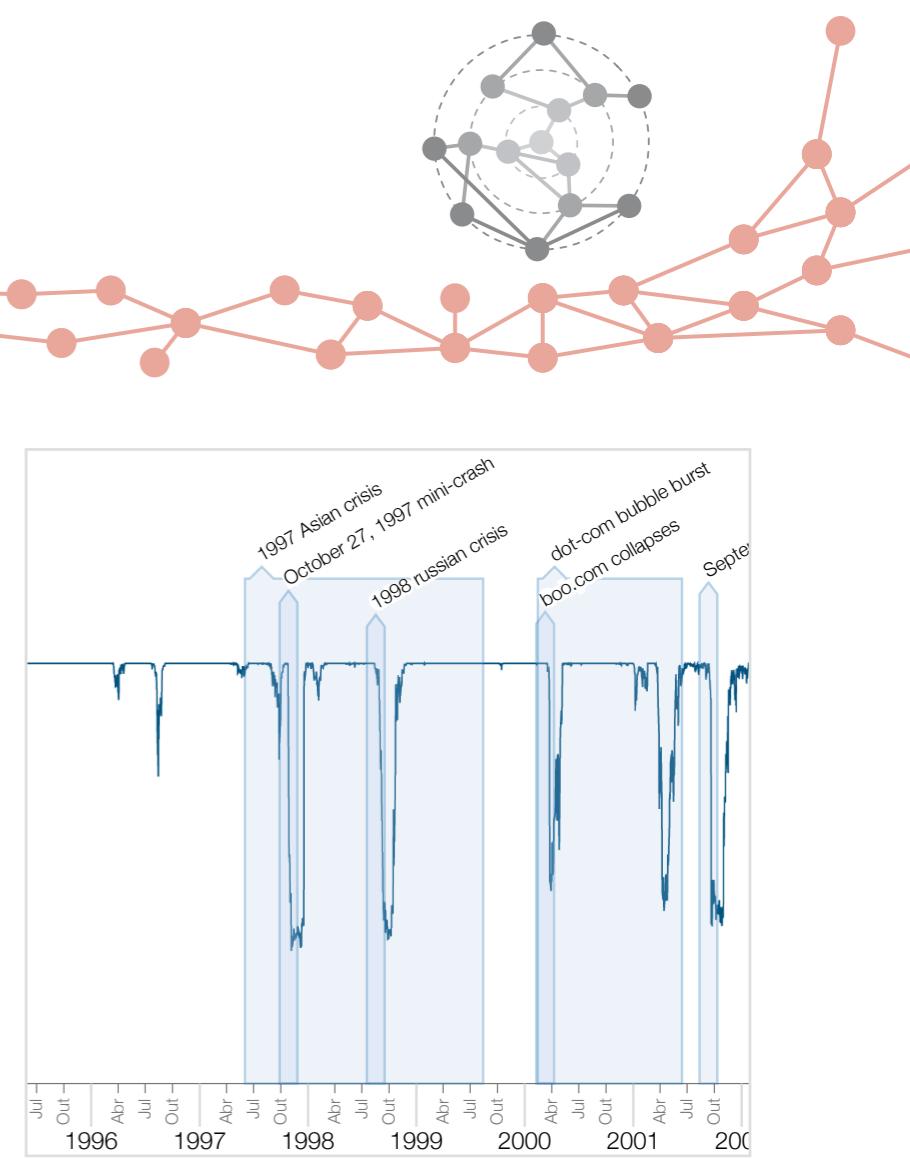
Applications



Authorship detection of books



Characterizing authors contributions



Detecting anomalies in networks generated from time series

Other uses of concentric symmetry performed by collaborators

Amancio DR (2015) A Complex Network Approach to Stylometry. PLOS ONE 10(8): e0136076. <https://doi.org/10.1371/journal.pone.0136076>

Arruda, H. F., Costa, L.da F. and Amancio, D.R., (2016)
Using complex networks for text classification: Discriminating informative and imaginative documents.
EPL (Europhysics Letters), 113(2), p.28007. <https://doi.org/10.1209/0295-5075/113/28007>

Current interests



References

- COSTA, L. da F. et al.
Analyzing and modeling real-world phenomena with complex networks: a survey of applications
Advances in Physics, v. 60, n. 3, p. 329--412, 2011.
- COSTA, L. da F.; SILVA, F. N.
Hierarchical characterization of complex networks
Journal of Statistical Physics, v. 125, n. 4, p. 845–876, 2006.
- COSTA, L. da F.; TOGNETTI, M. A. R.; SILVA, F. N.
Concentric characterization and classification of complex network nodes: Application to an institutional collaboration network
Physica A, v. 387, n. 24, p. 6201--6214, 2008.
- SILVA, F.N.; COMIN, C.H.; PERON, T.K.DM.; RODRIGUES, F.A.; YE, C.; WILSON, R.C.; HANCOCK, E.; COSTA, L. da F.
Concentric network symmetry
Information Sciences, v. 333, p. 61 – 80, 2015.
- COMIN, C. H.; SILVA, F. N.; COSTA, L. da F.
A framework for evaluating complex networks measurements.
EPL (Europhysics Letters), 110(6), 68002, 2015.
- AMANCIO, D. R.; SILVA, F. N.; COSTA, L. da F.
Concentric network symmetry grasps authors' styles in word adjacency networks
EPL (Europhysics Letters). Volume 110, Issue 6, 68001, 2015.

<http://cyvision.ifsc.usp.br/software/networks3d>

Symmetry of adjacency networks



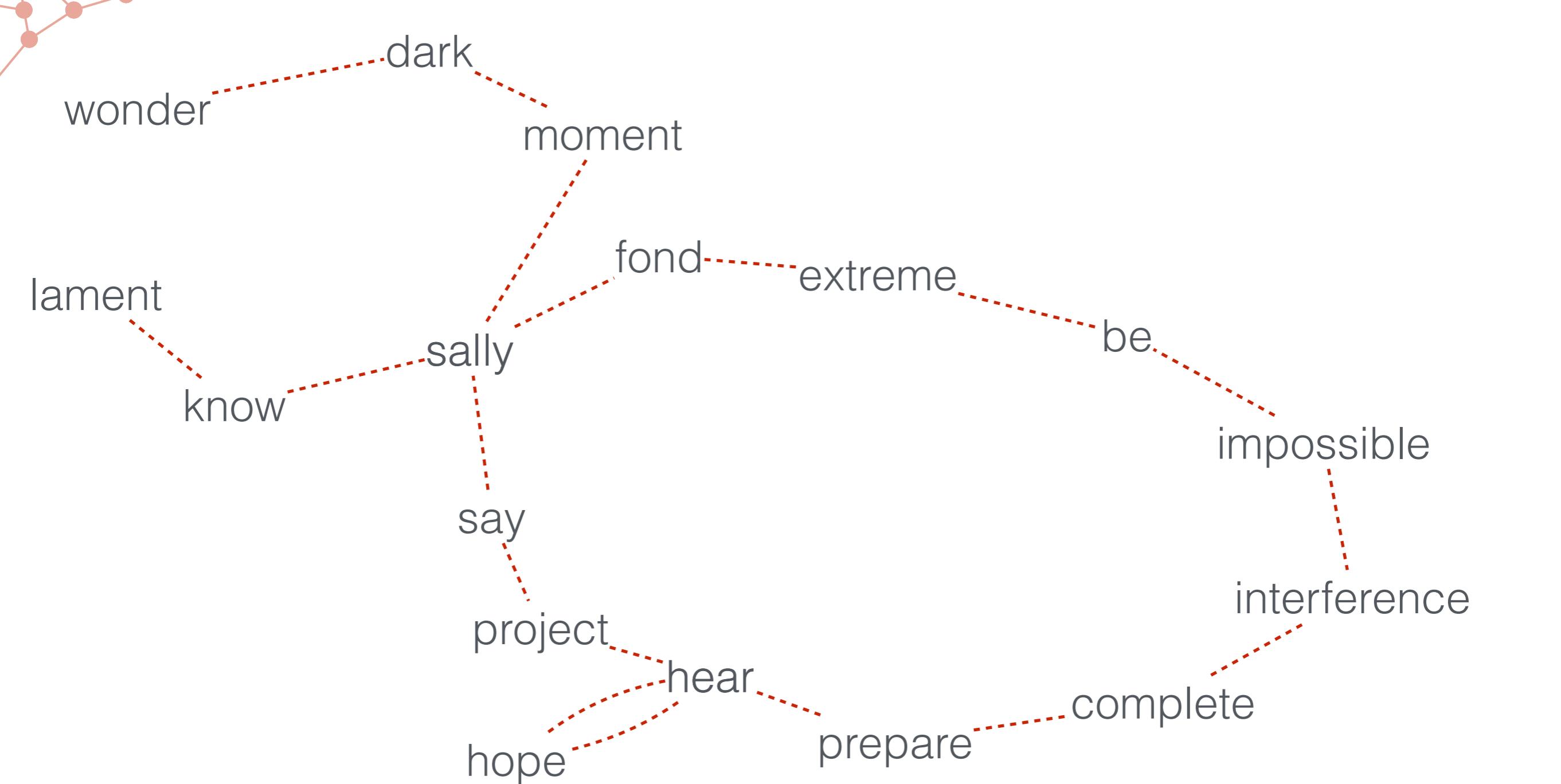
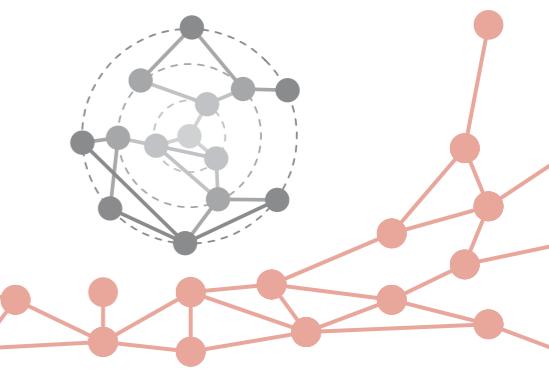
wonder dark
moment sally say
project hear
hope hear prepare
complete interference
impossible be extreme
fond sally know
lament

Concentric network symmetry grasps authors' styles in word adjacency networks

D.R. Amancio and F.N. Silva and L. da F. Costa

Europhysics Letters. Volume 110, Issue 6, 68001 (2015)

Symmetry of adjacency networks

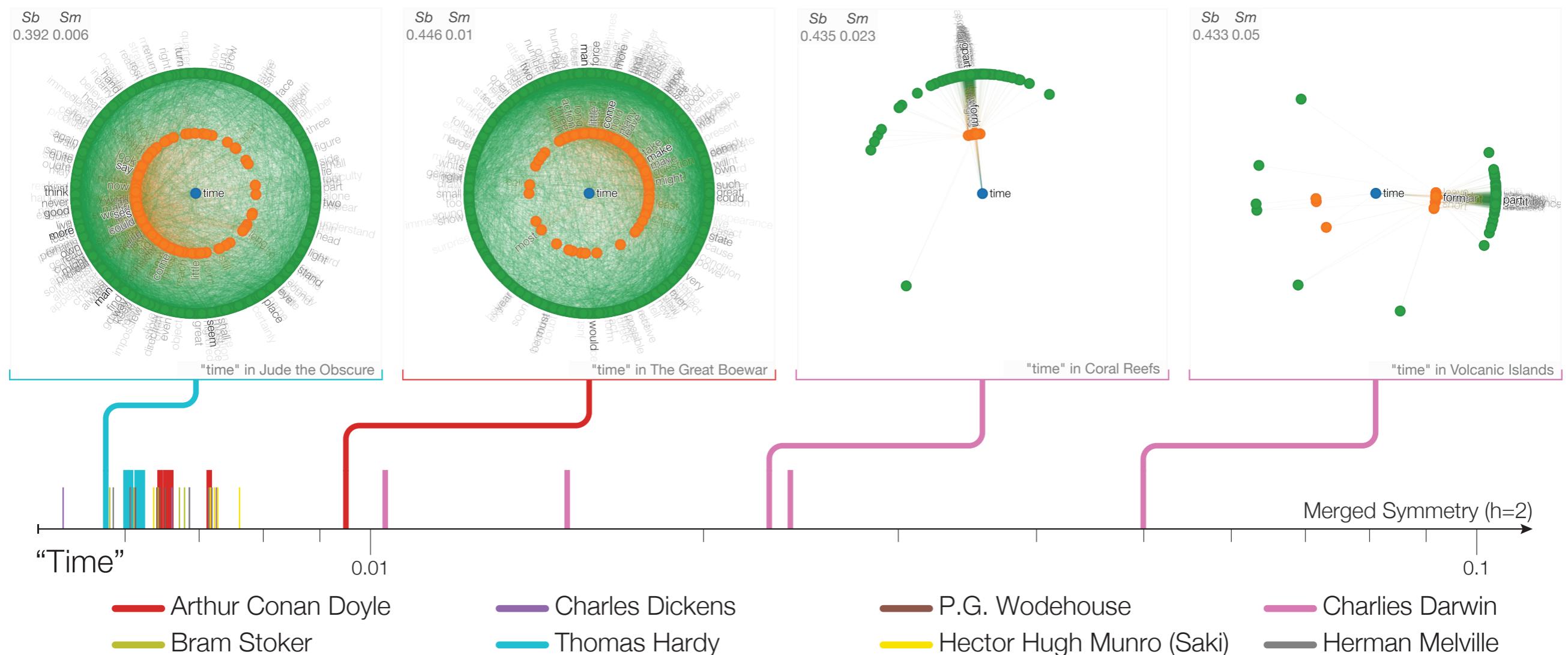
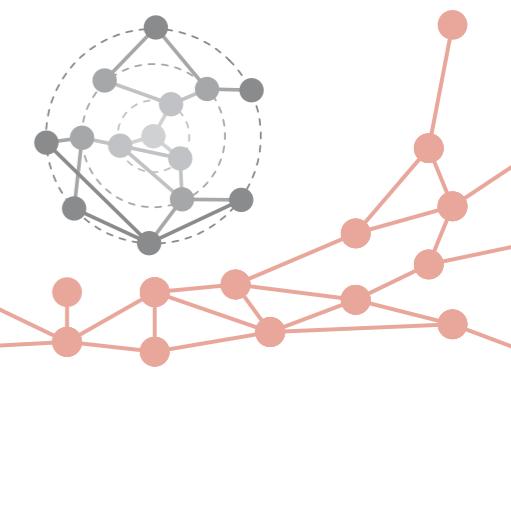


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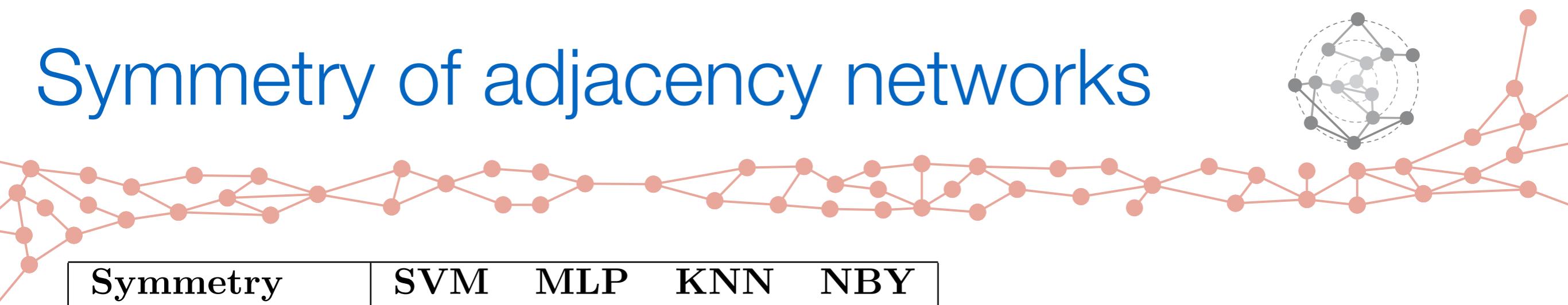
8 authors

Concentric network symmetry grasps authors' styles in word adjacency networks

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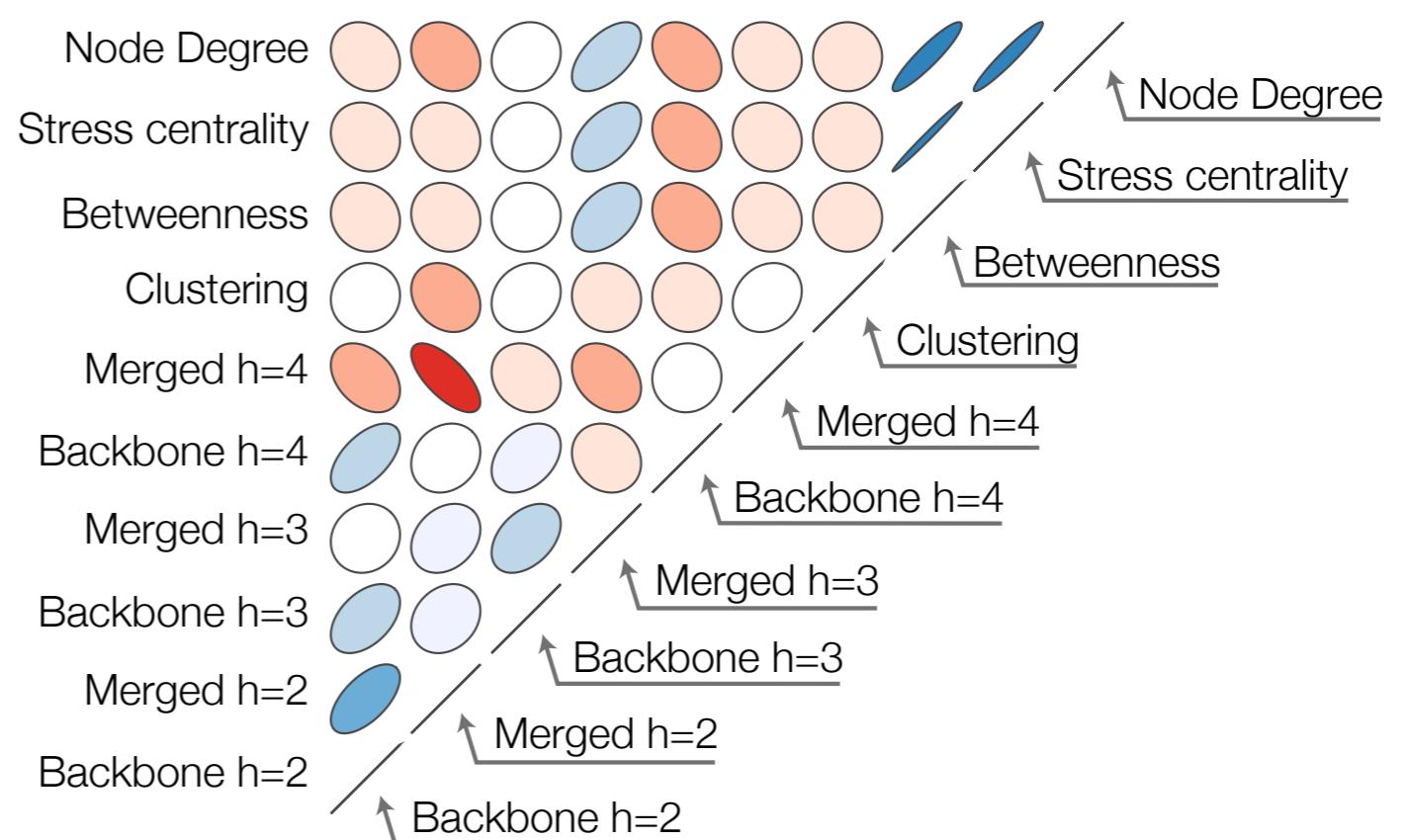
Symmetry of adjacency networks



Symmetry	SVM	MLP	KNN	NBY
Merged $h = 2$	75.0%	72.5%	55.0%	42.5%
Merged $h = 3$	70.0%	62.5%	65.0%	40.0%
Merged $h = 4$	82.5%	82.5%	57.5%	42.5%
Backbone $h = 2$	32.5%	32.5%	20.0%	20.0%
Backbone $h = 3$	70.0%	72.5%	57.5%	27.5%
Backbone $h = 4$	70.0%	82.5%	57.5%	42.5%

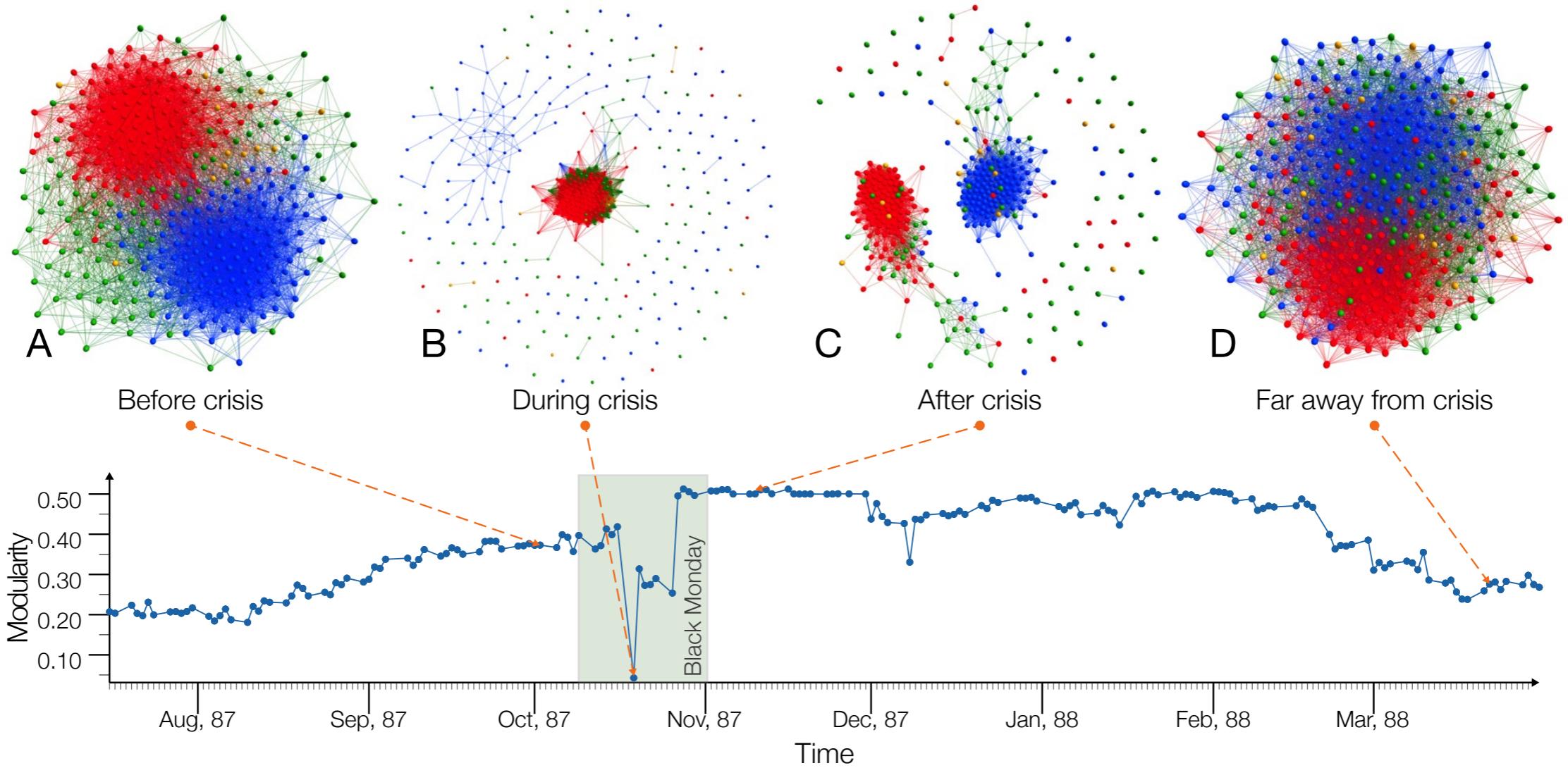
Accuracy rates found
for the authorship
detection task.

Pearson correlation coefficients
between symmetry and other
traditional network measurements



Other applications

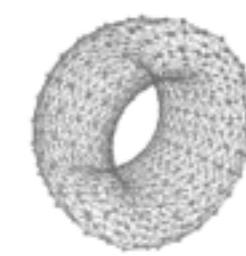
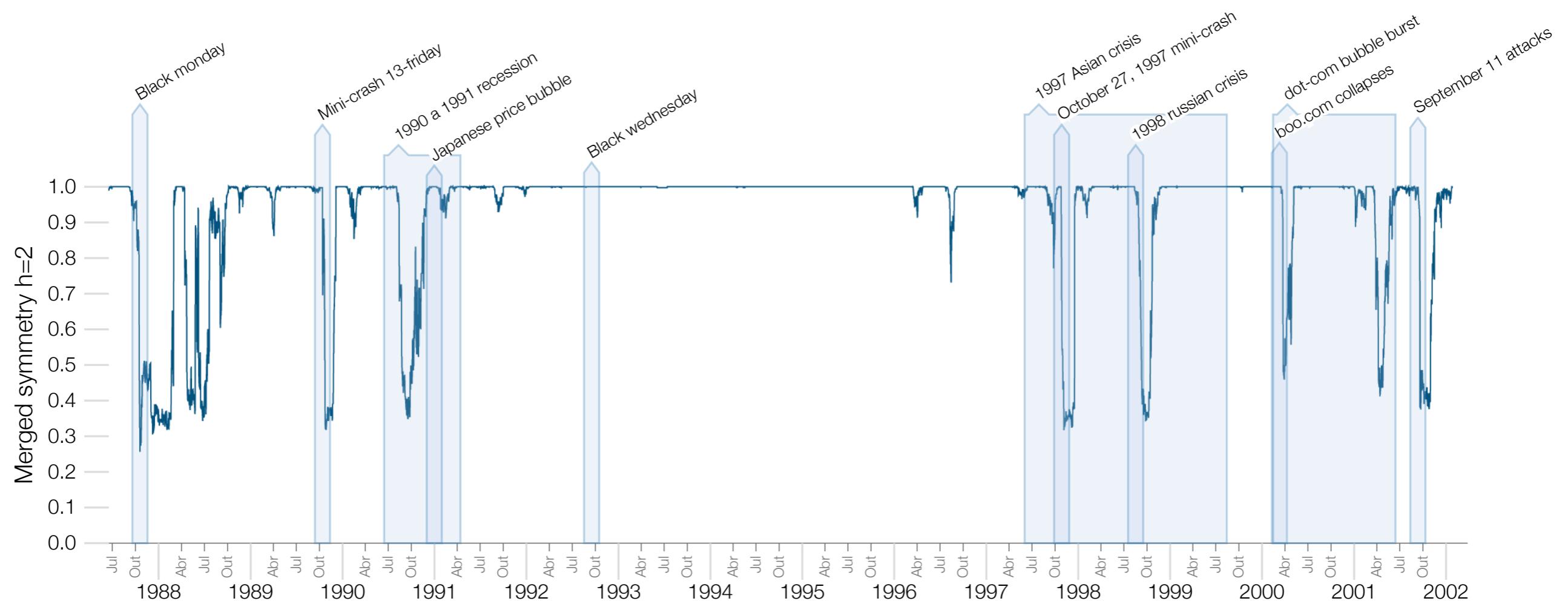
Financial market networks



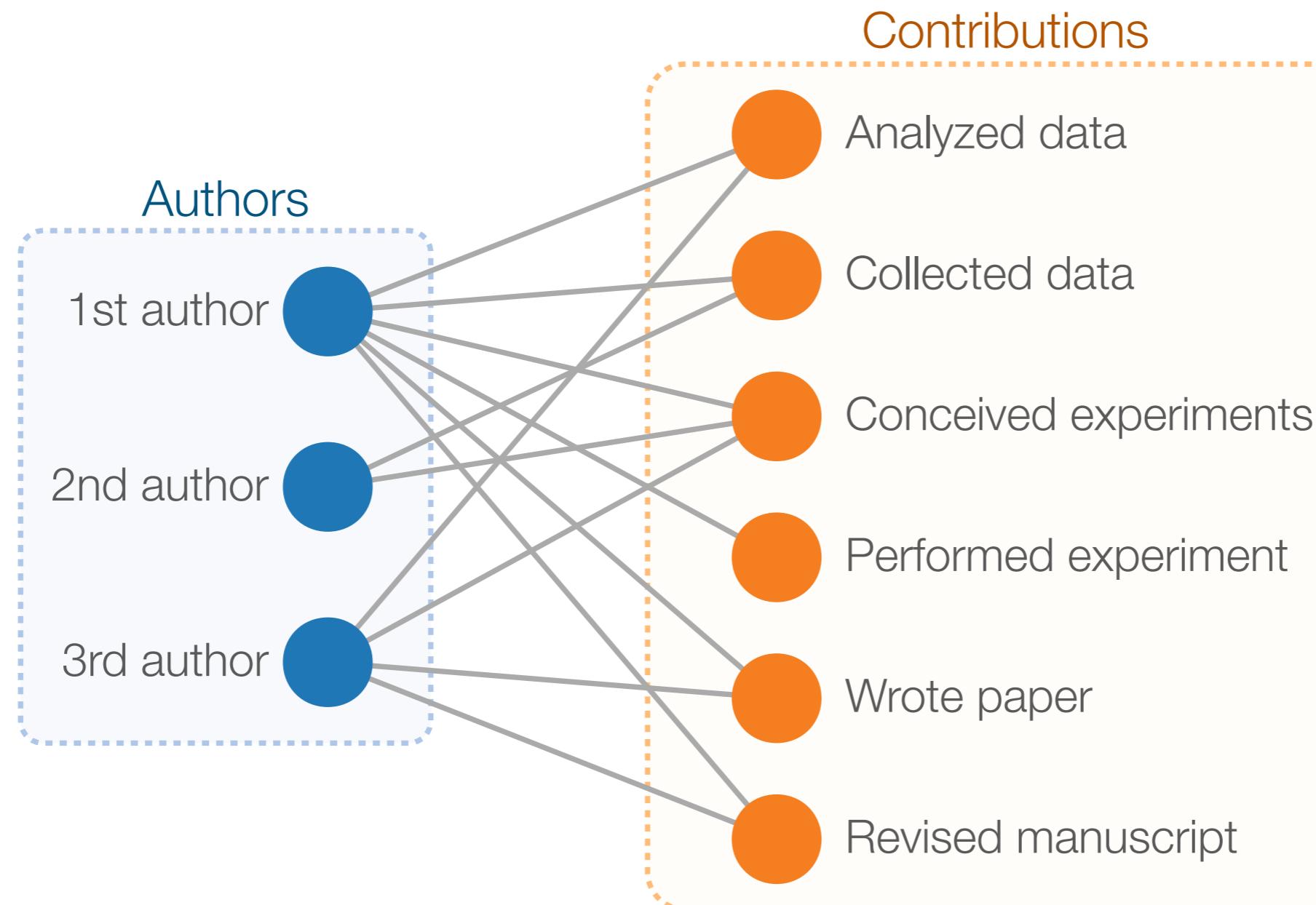
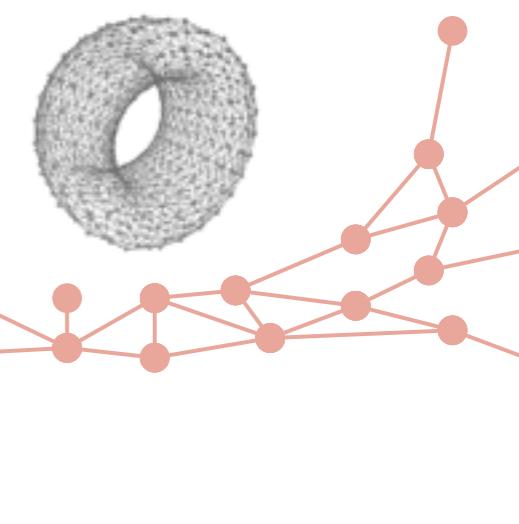
SILVA, F. N.; COMIN, C. H.; PERON, T. K. D.; RODRIGUES, F. A.; YE, C.; WILSON, R. C.; HANCOCK, E.; COSTA, L. da F.
On the modular dynamics of financial market networks. 2015 <<http://arxiv.org/abs/1501.05040>>

Other applications

Financial market networks



Patterns of authors contribution in scientific manuscripts

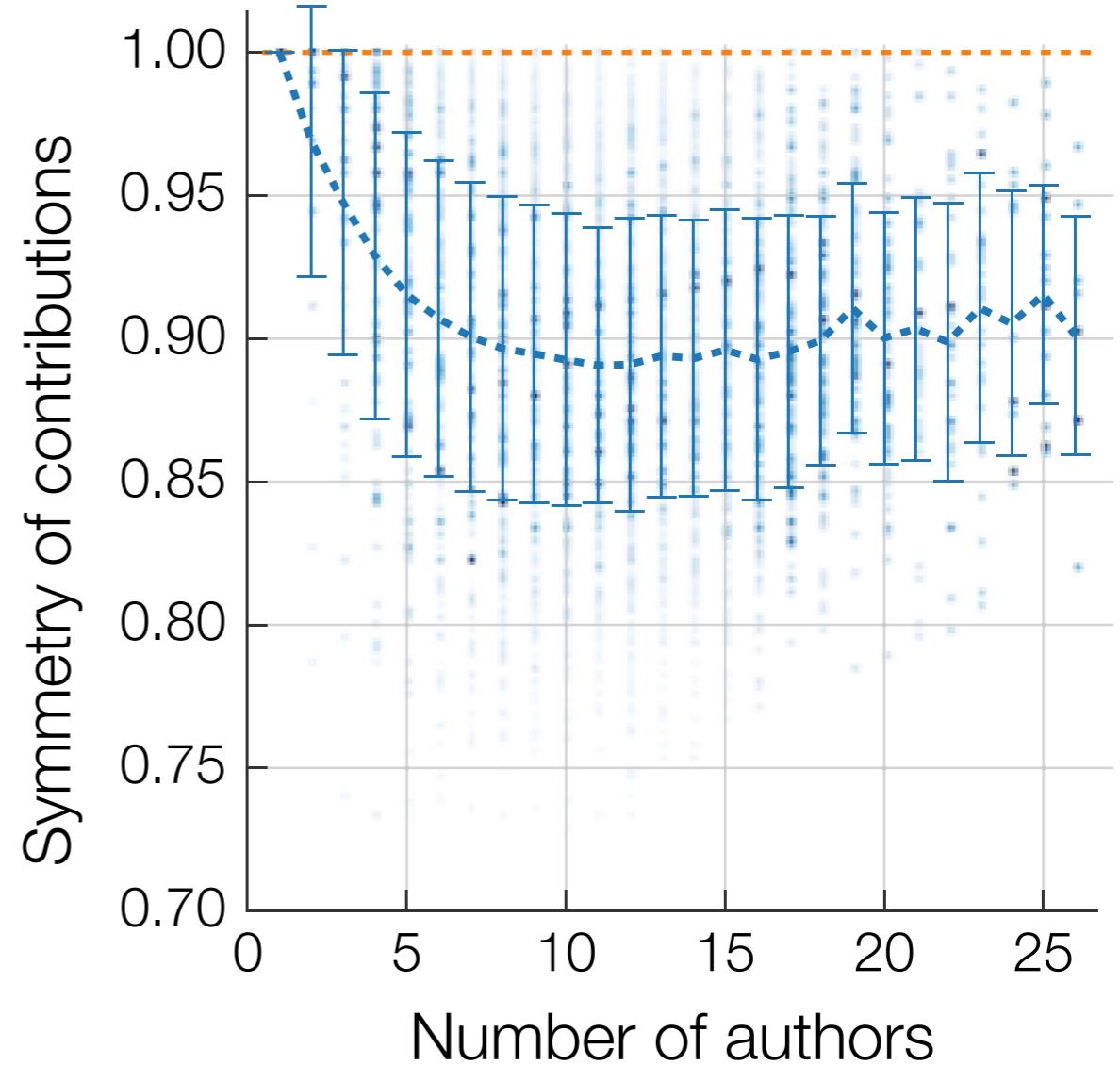
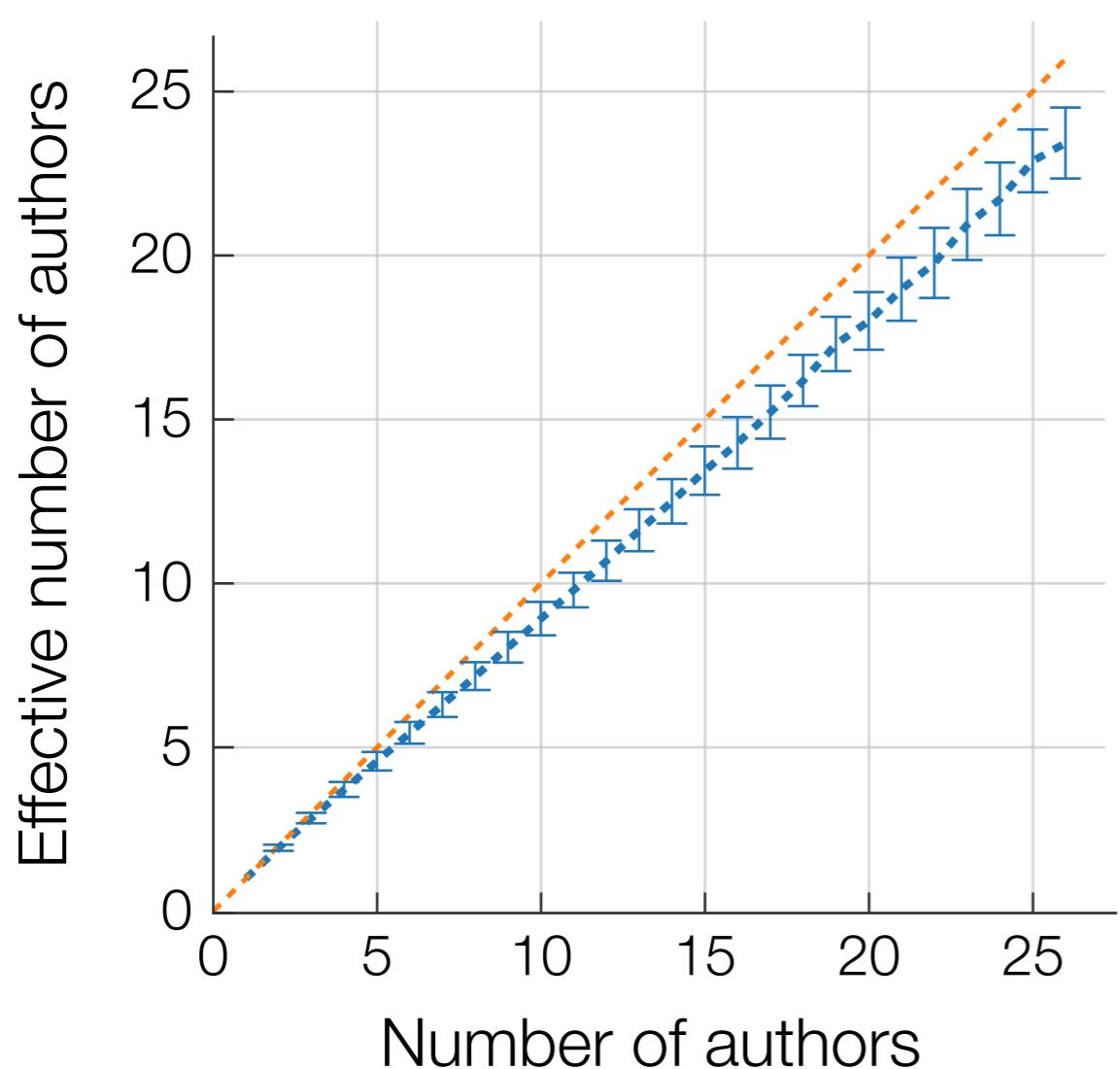
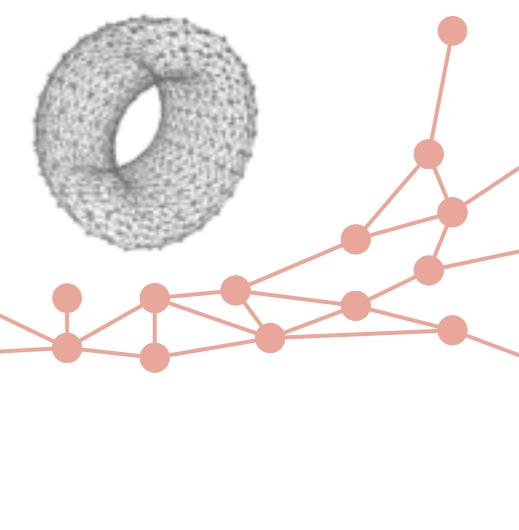


Dataset: <http://cyvision.ifsc.usp.br/patternsauthors>

E. A. Corrêa Jr., F. N. Silva, L. da F. Costa, D. R. Amancio.

Patterns of authors contribution in scientific manuscripts. *Journal of Informetrics* v.11, n. 2, 2017.

Patterns of authors contribution in scientific manuscripts

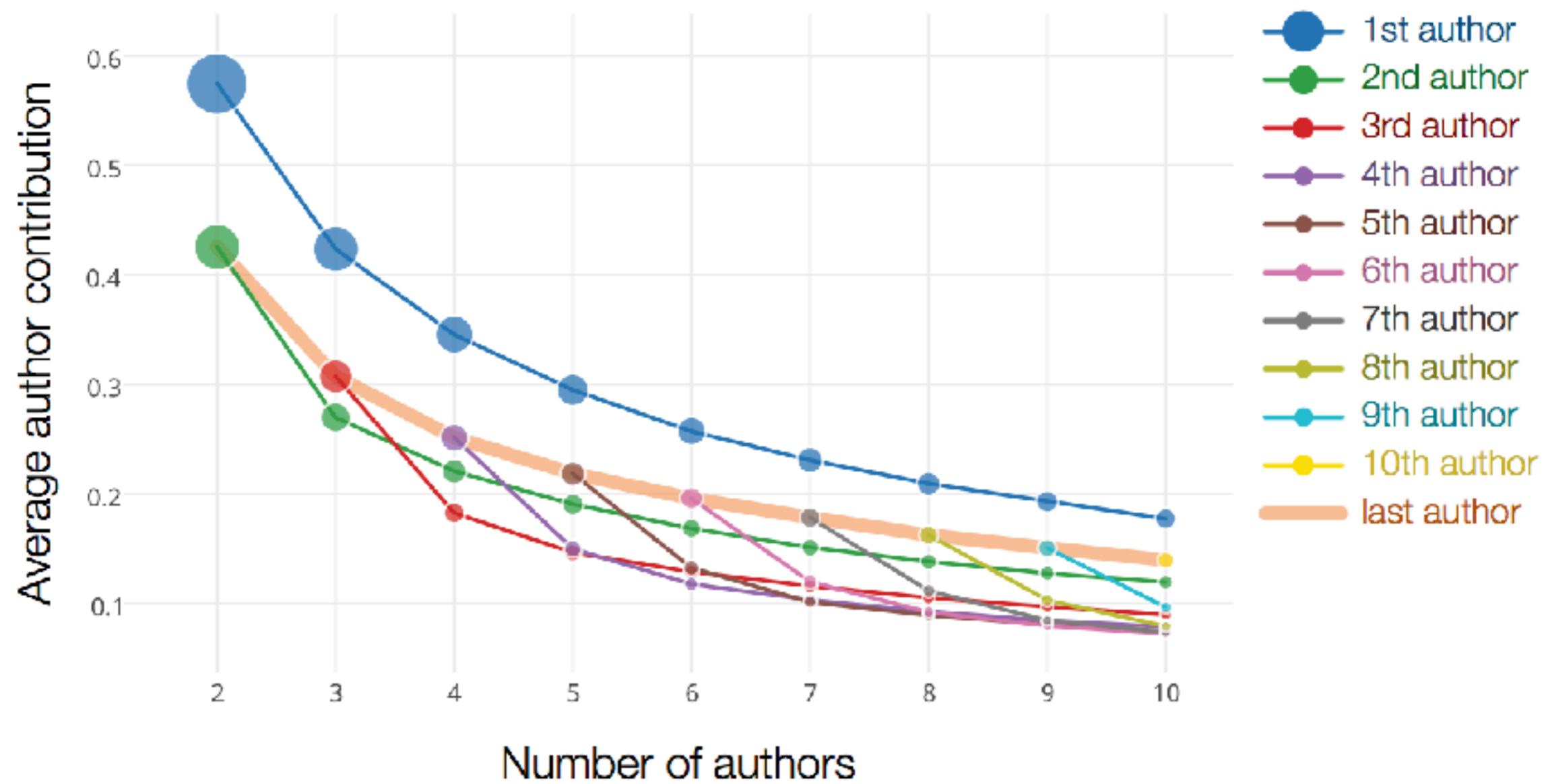
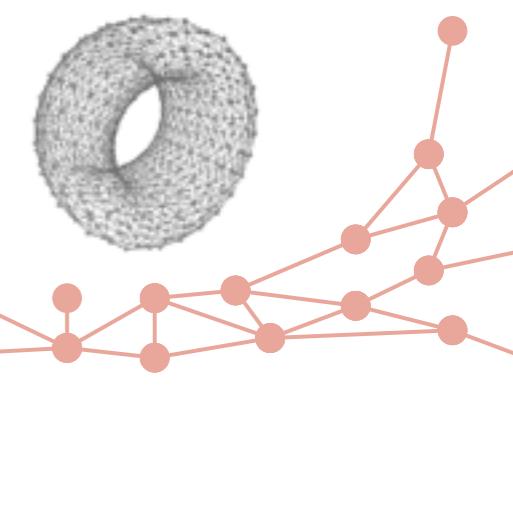


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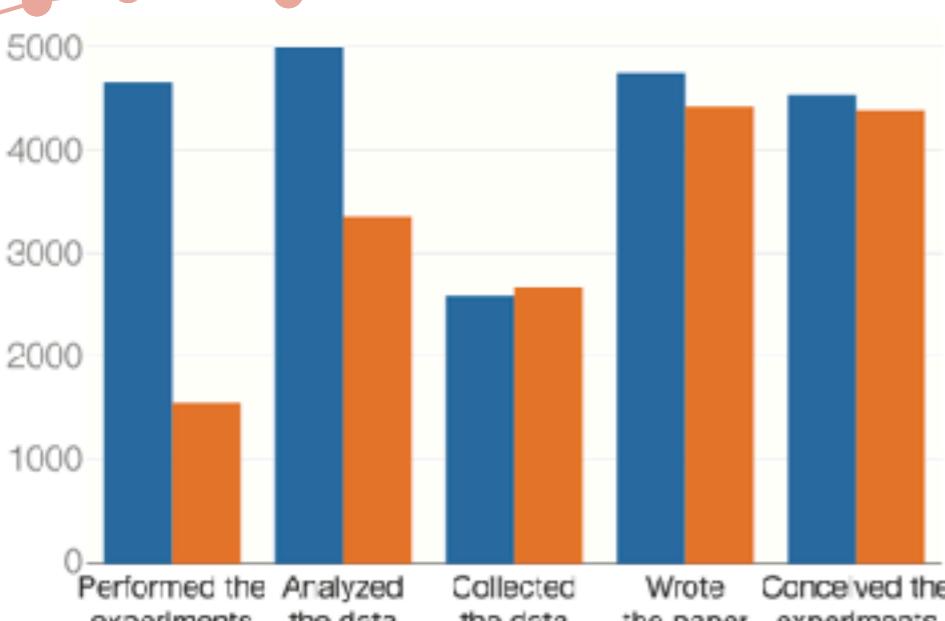
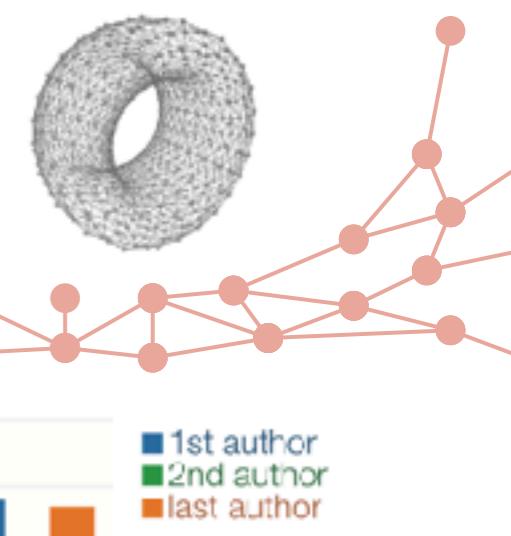


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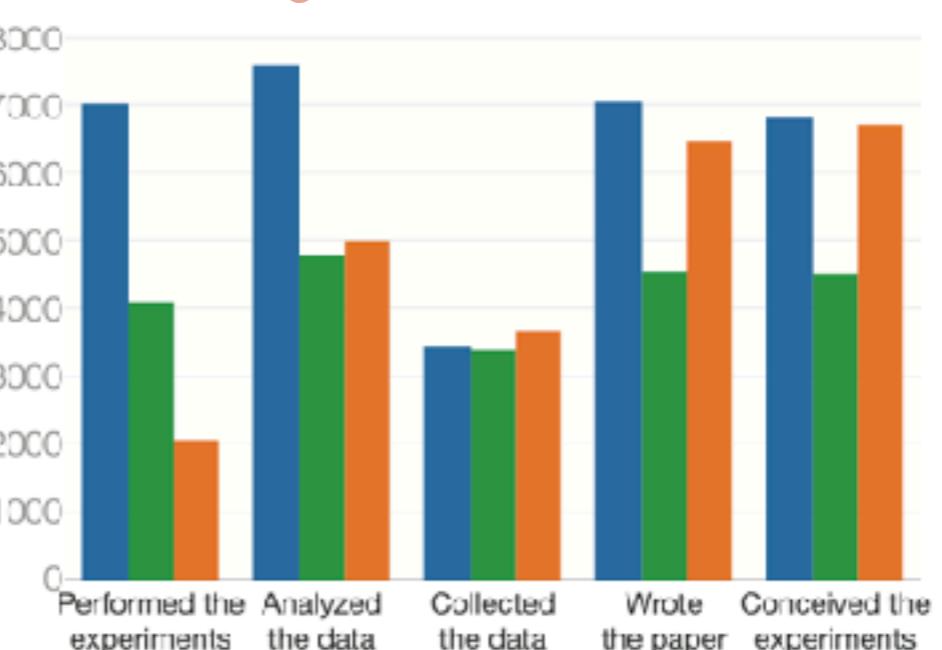
E. A. Corrêa Jr., F. N. Silva, L. da F. Costa, D. R. Amancio.

Patterns of authors contribution in scientific manuscripts. *Journal of Informetrics* v.11, n. 2, 2017.

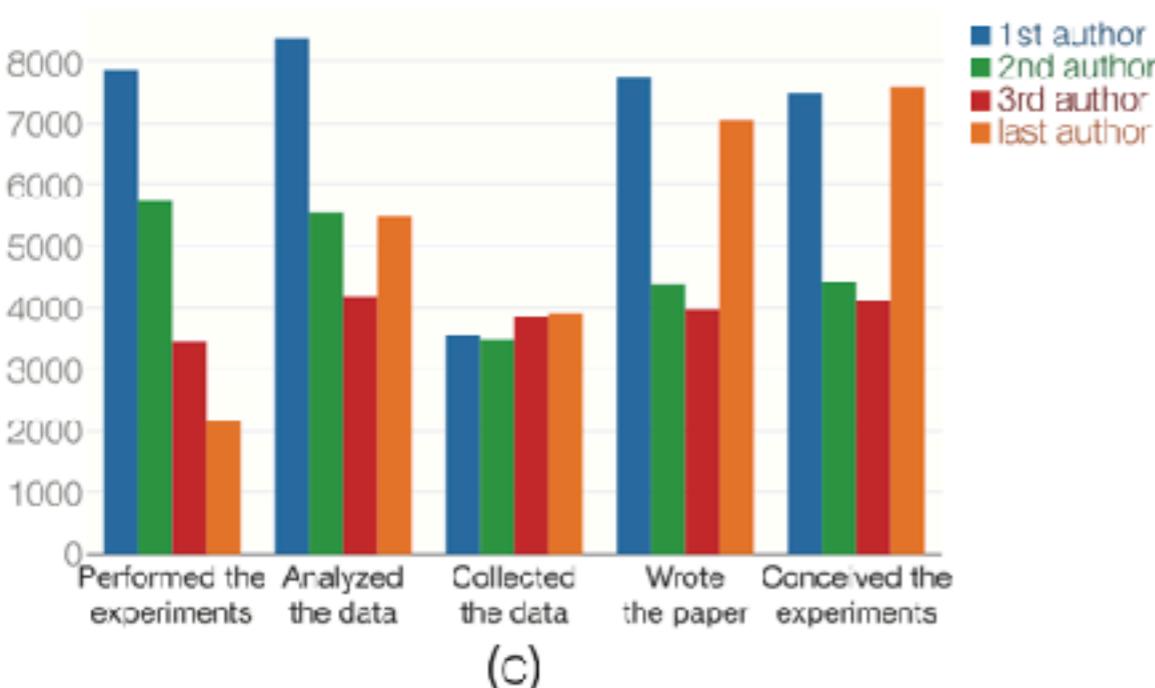
Patterns of authors contribution in scientific manuscripts



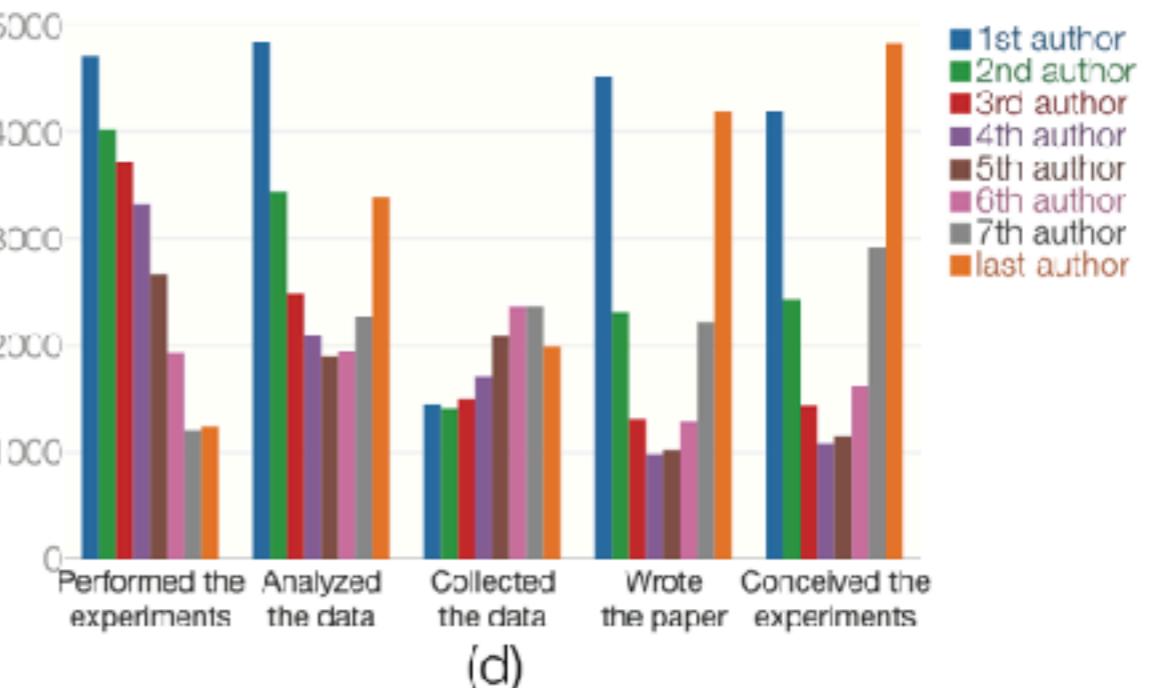
(a)



(b)

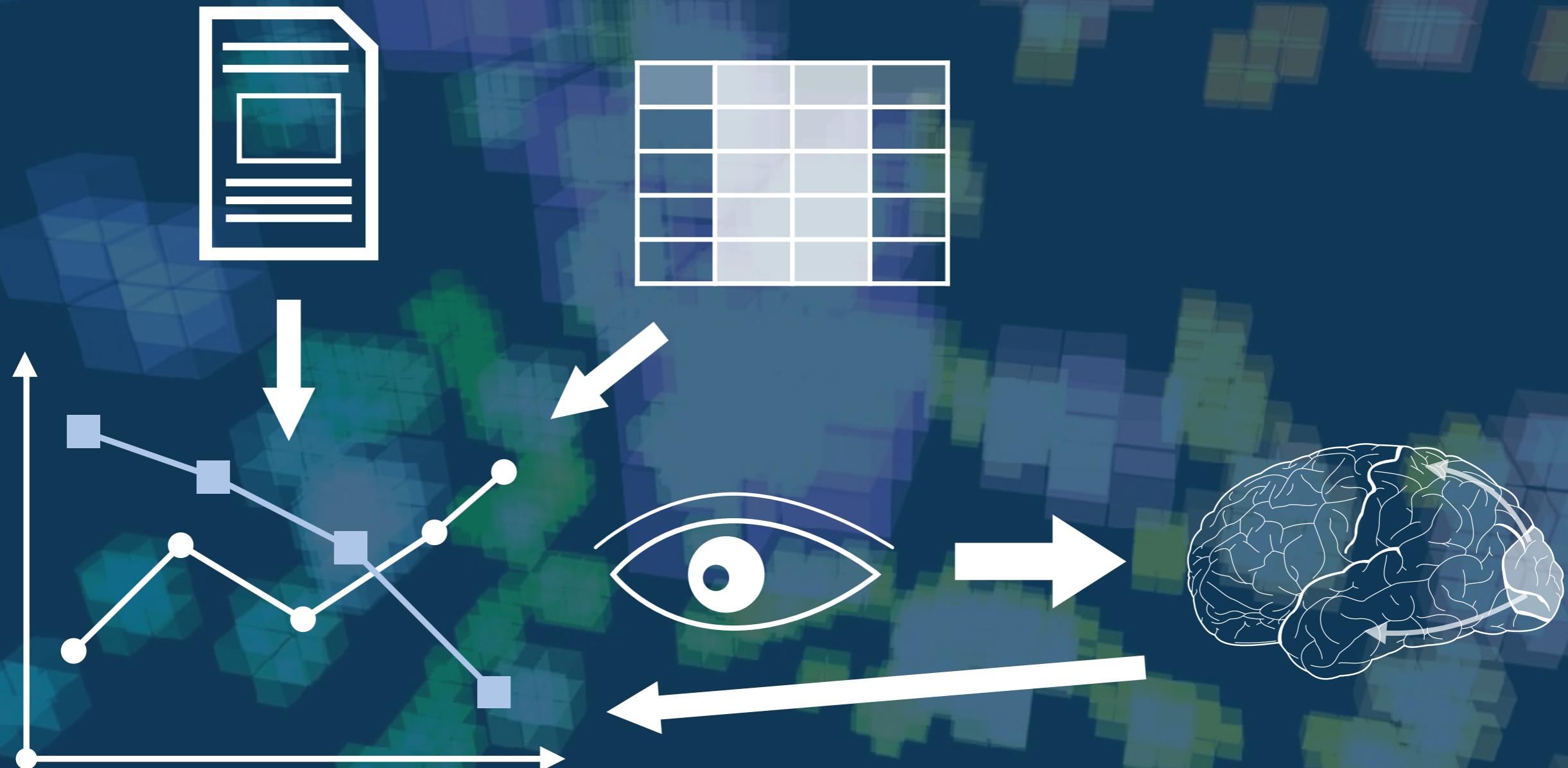


(c)

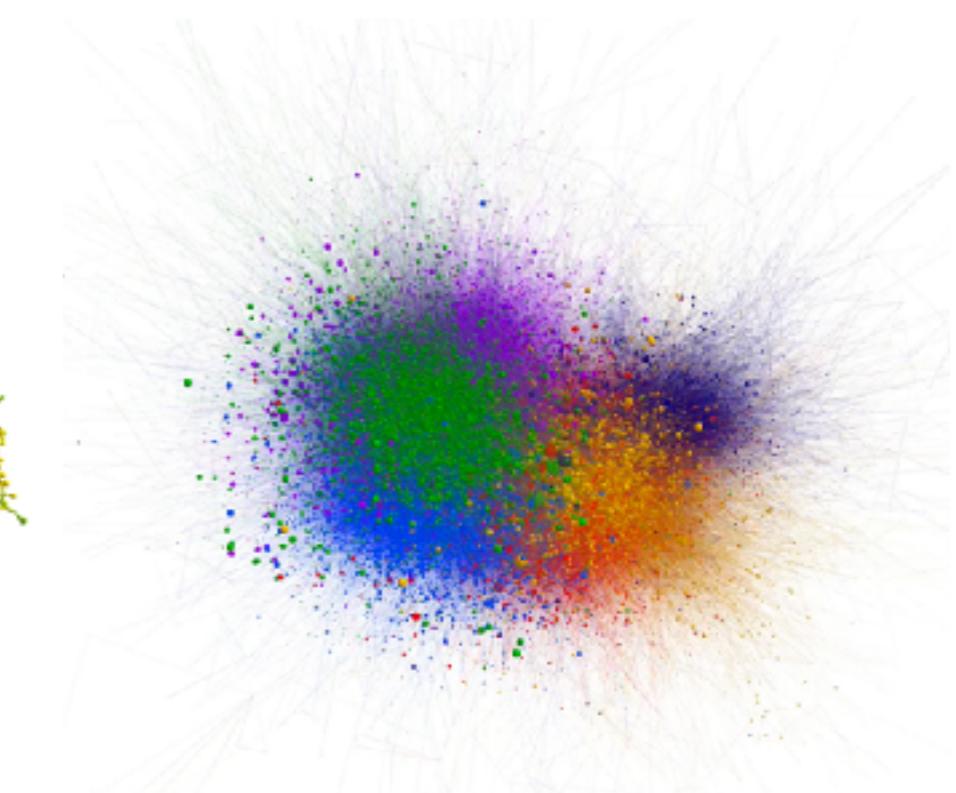
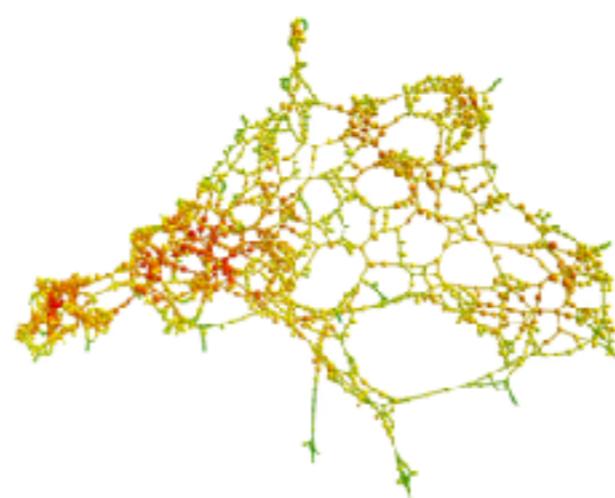
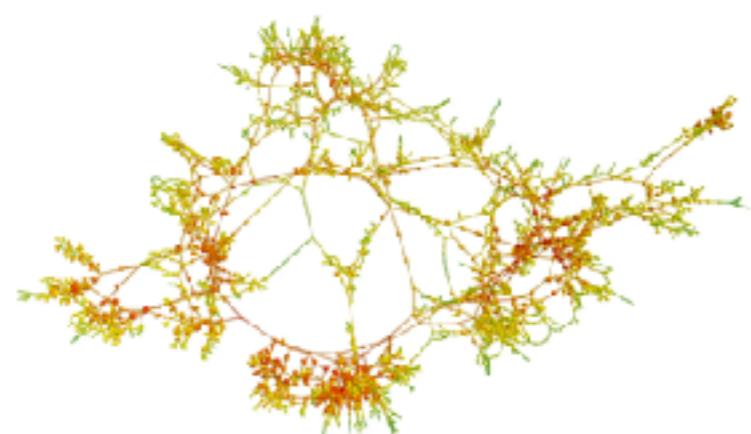
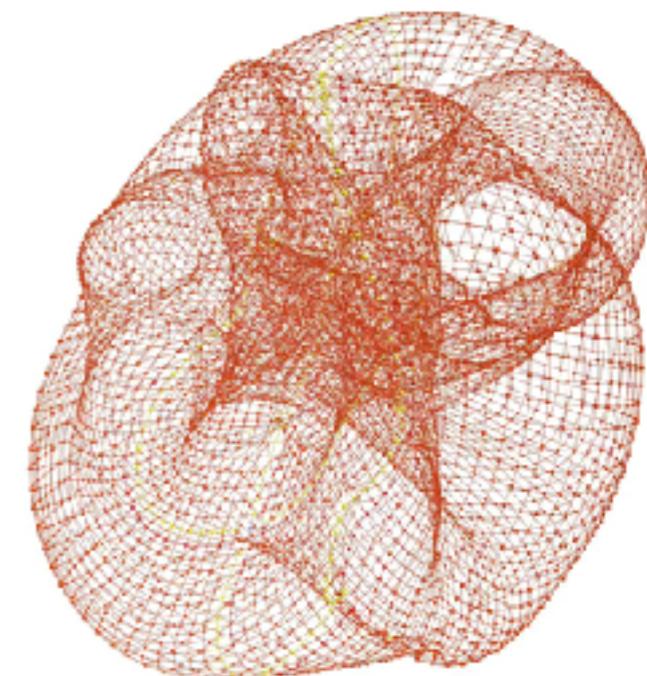
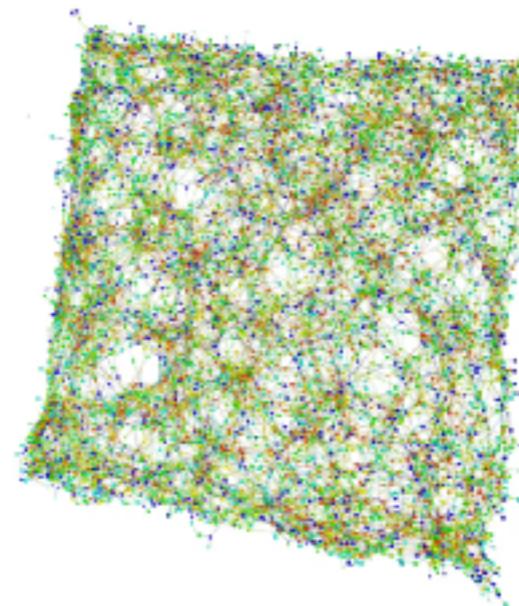
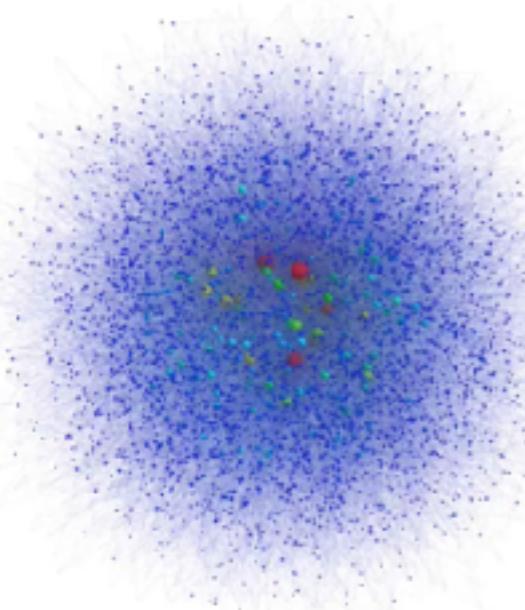


(d)

Visualization

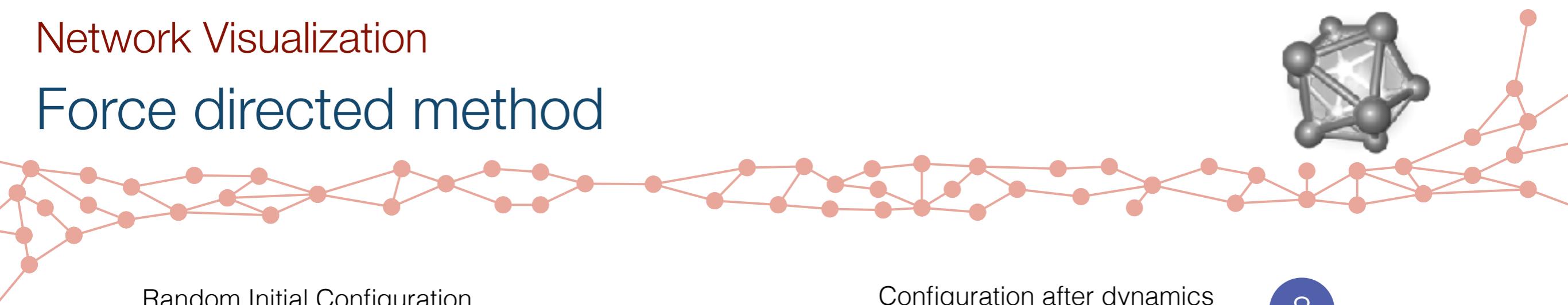


Complex networks + visualization

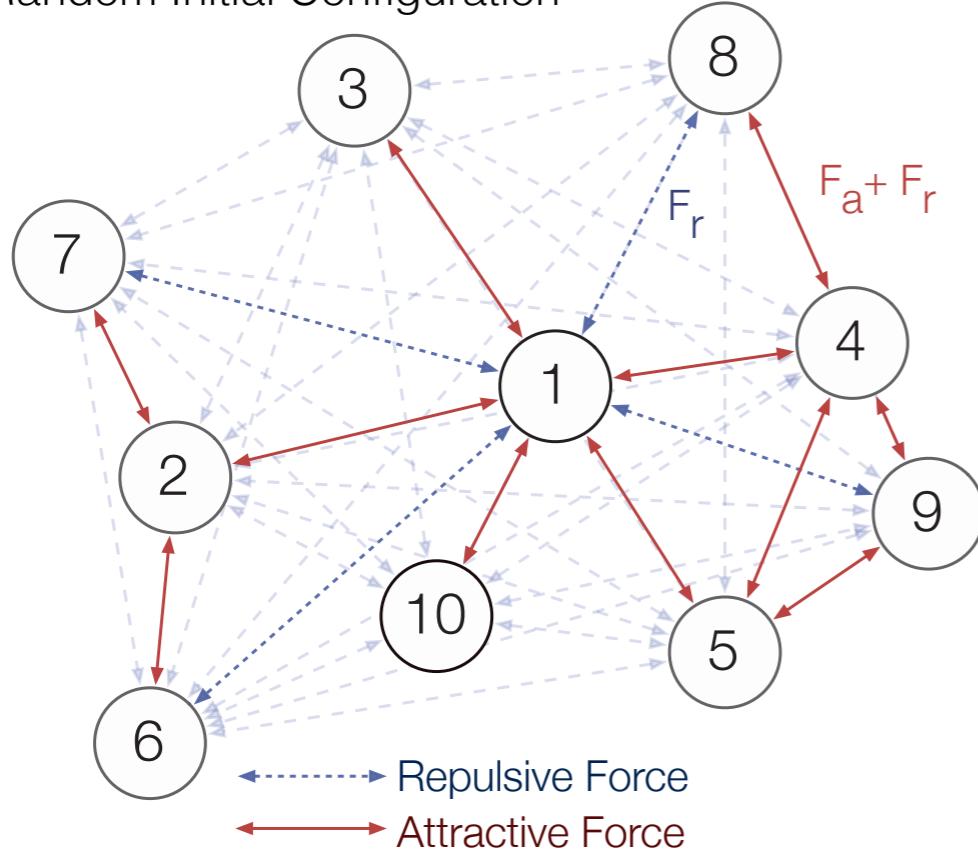


Network Visualization

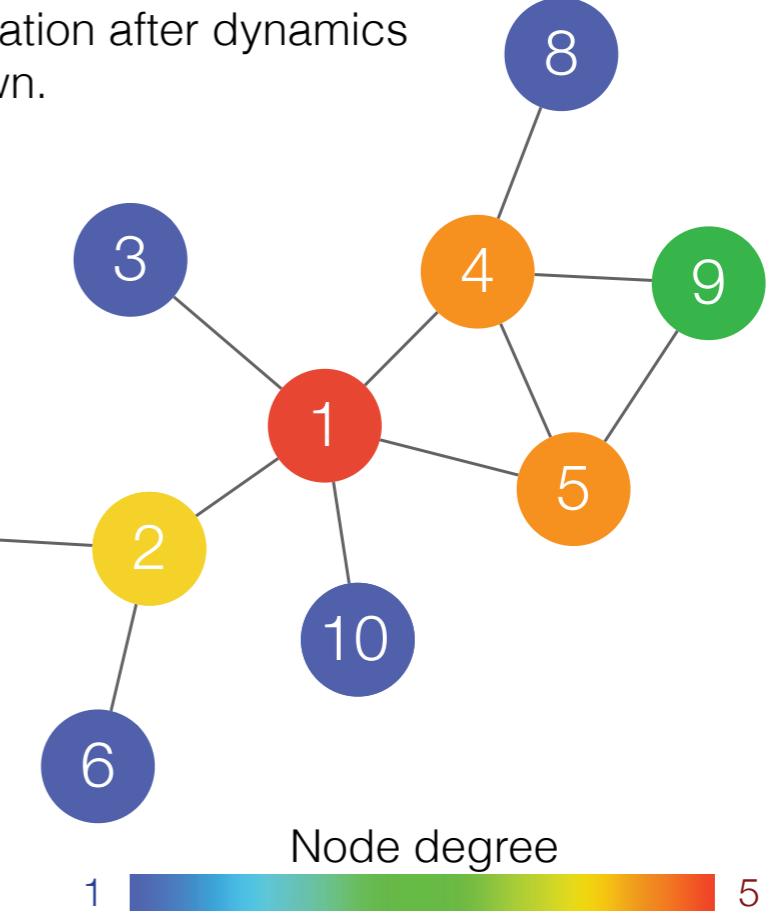
Force directed method



Random Initial Configuration



Configuration after dynamics cool-down.



Molecular
Dynamics
Simulation

Attractive Force

$$\vec{F}_{(a)j} = \sum_{(i,j) \in \mathcal{E}} a_{ij} (\vec{R}_i - \vec{R}_j)^2 \hat{r}_{ij}$$

Repulsive Force

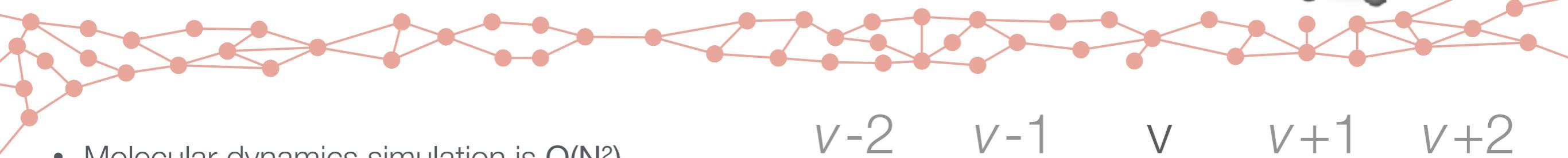
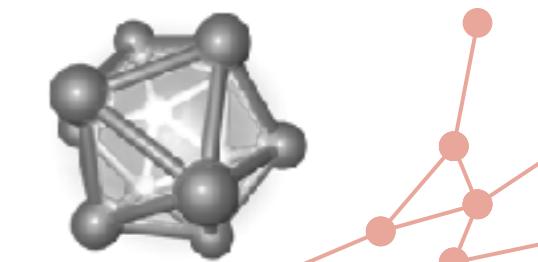
$$\vec{F}_{(r)j} = \sum_{i \in \mathcal{V}} \frac{-b}{(\vec{R}_i - \vec{R}_j)^2} \hat{r}_{ij}$$

Viscosity is used for cooling the system

$$\frac{d^2 \vec{R}_j}{d^2 t} = \vec{F}_{(a)i} + \vec{F}_{(r)j} - \mu \frac{d \vec{R}_j}{dt}$$

We use Runge-Kutta iterative method.

Network Visualization Optimizations

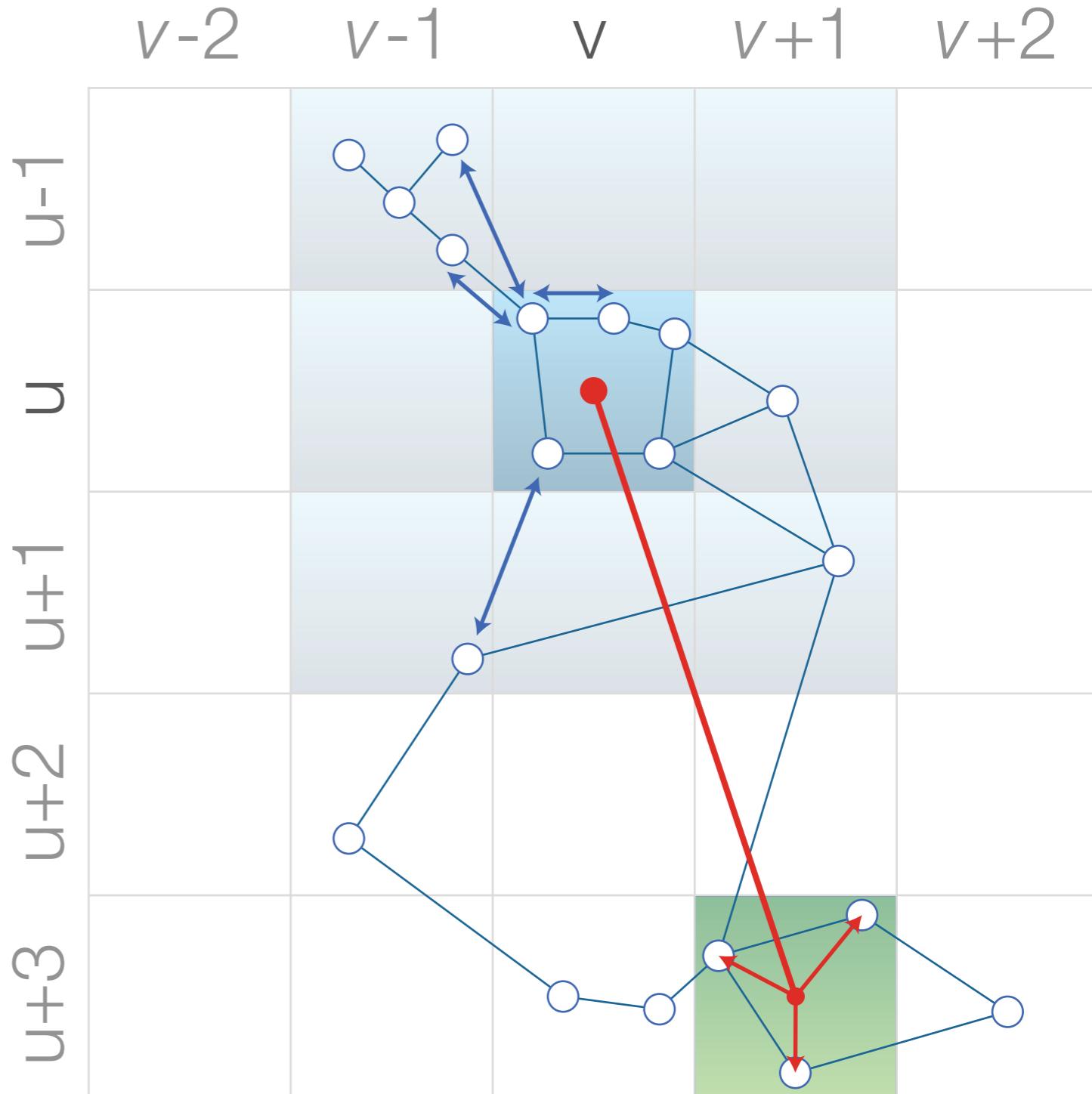


- Molecular dynamics simulation is $O(N^2)$.
- We can use multipole expansion:

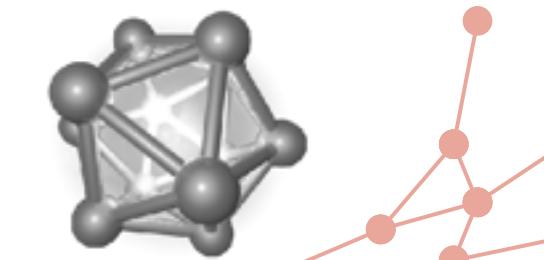
$$\sum_{i \in \mathcal{V}} \frac{\hat{r}_{ij}}{(\vec{R}_i - \vec{R}_j)^2} = -\vec{\nabla} \sum_{i \in \mathcal{V}} \frac{1}{|\vec{R}_i - \vec{R}_j|} = -\vec{\nabla} \phi(\vec{R}_j)$$

$$\phi(\vec{R}_j) \propto \frac{N_{u,v}}{|\vec{R}_j|} + \frac{\vec{p}_{u,v} \cdot \vec{R}_j}{|\vec{R}_j|^3} + \frac{1}{2} \sum_m^3 \sum_n^3 \frac{(Q_{u,v})_{mn} (R_j)_m (R_j)_n}{|\vec{R}_j|^5} + \dots$$

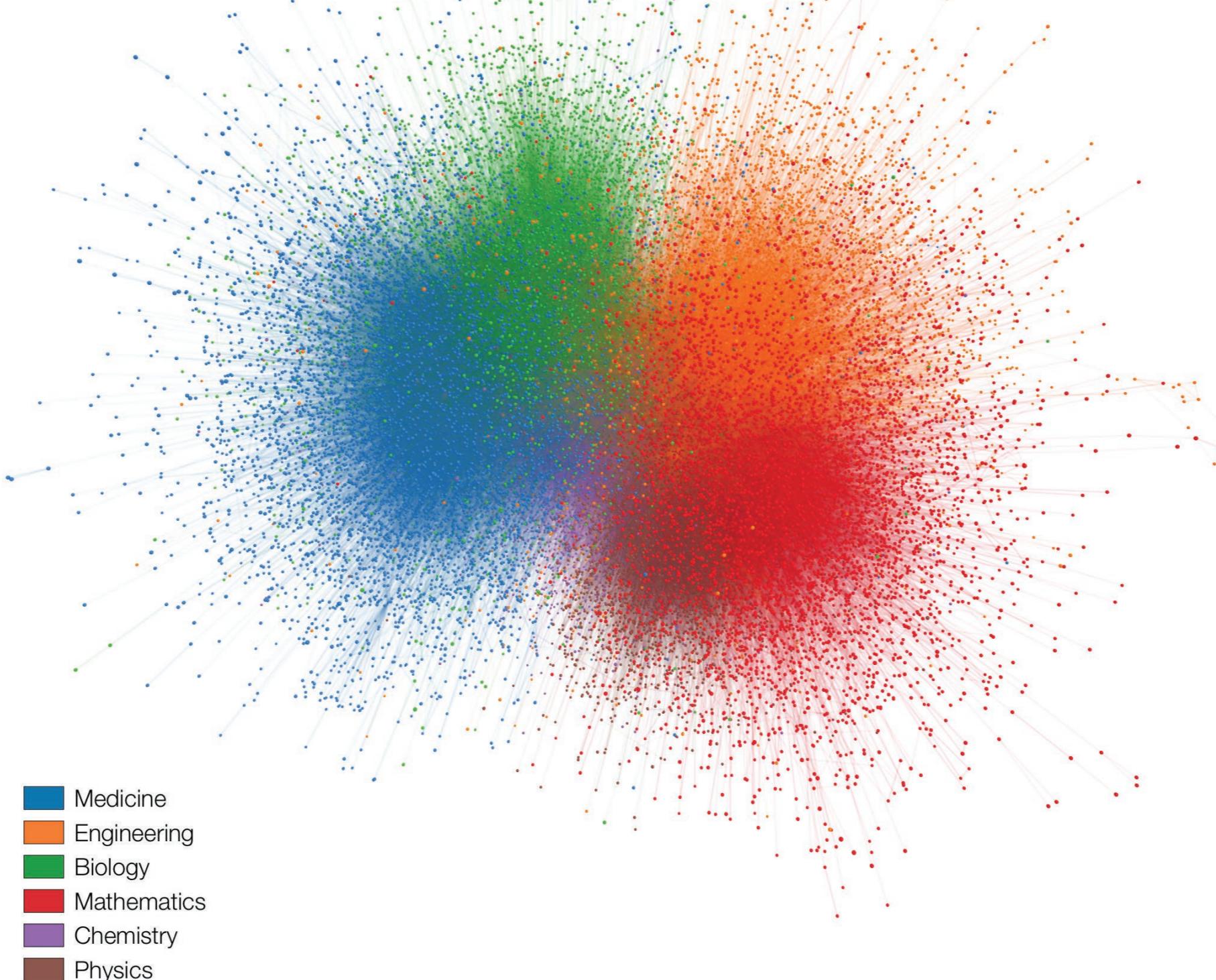
- Where $N_{u,v}$, $\vec{p}_{u,v}$ e $Q_{u,v}$ are monopole, dipole e quadrupole moments on box (u,v) .
- Quadrupole is OK for most of networks.



Network Visualization Examples

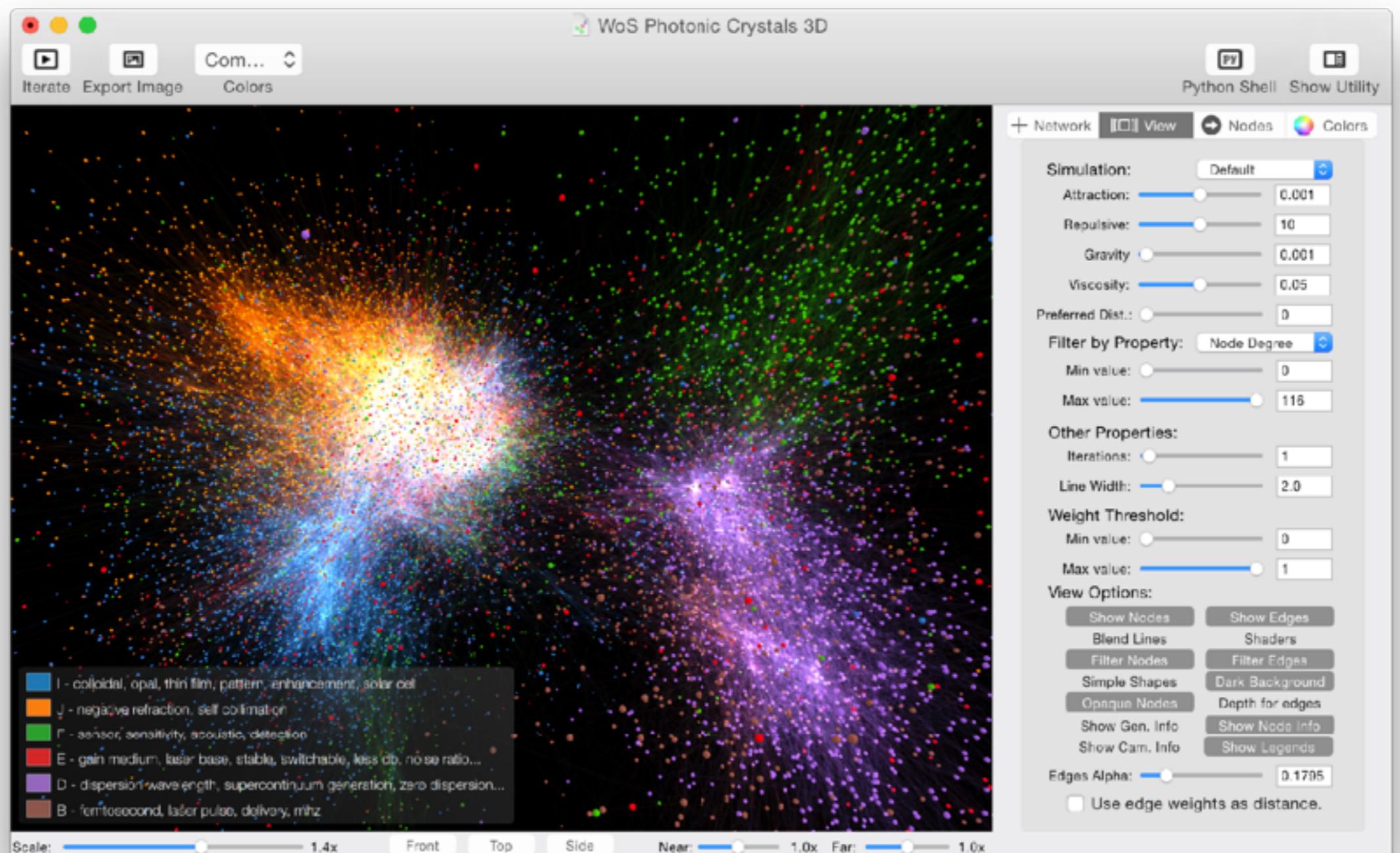
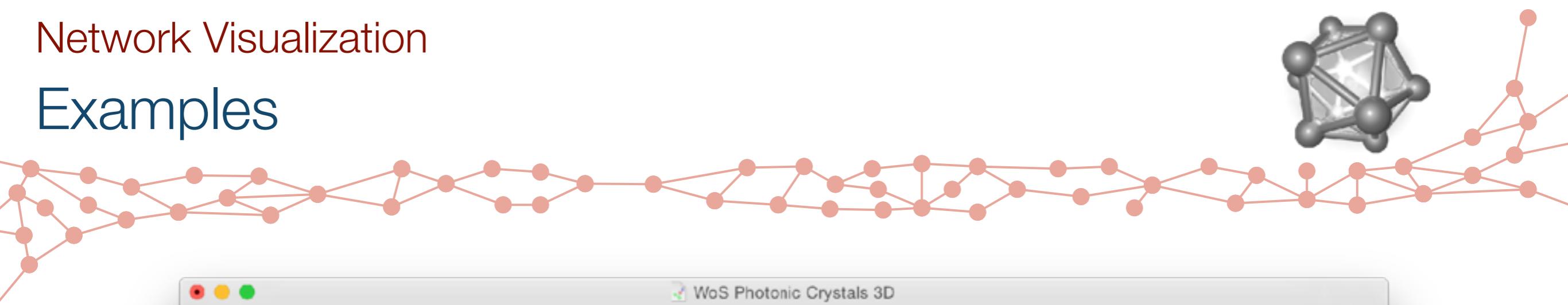


Wikipedia Network



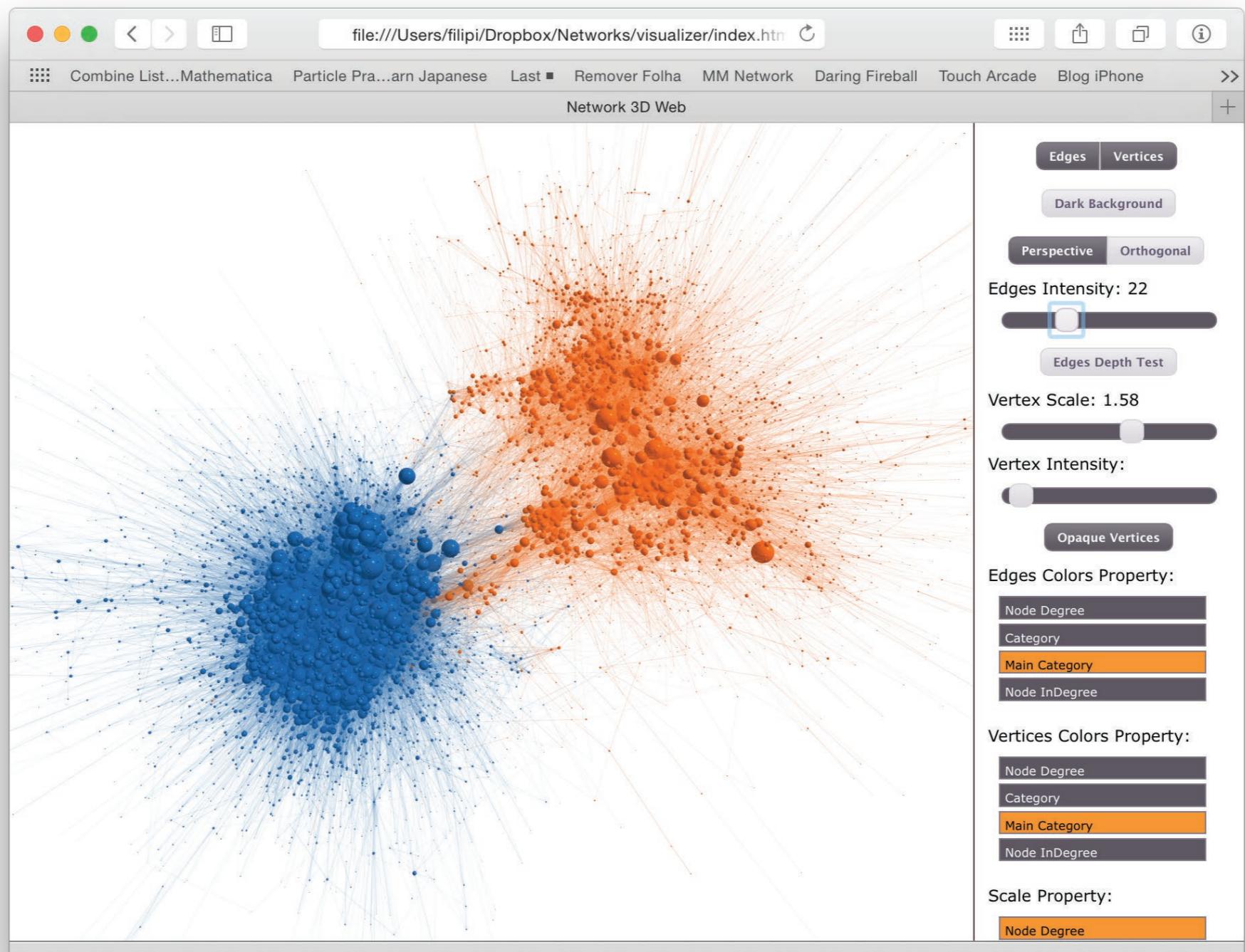
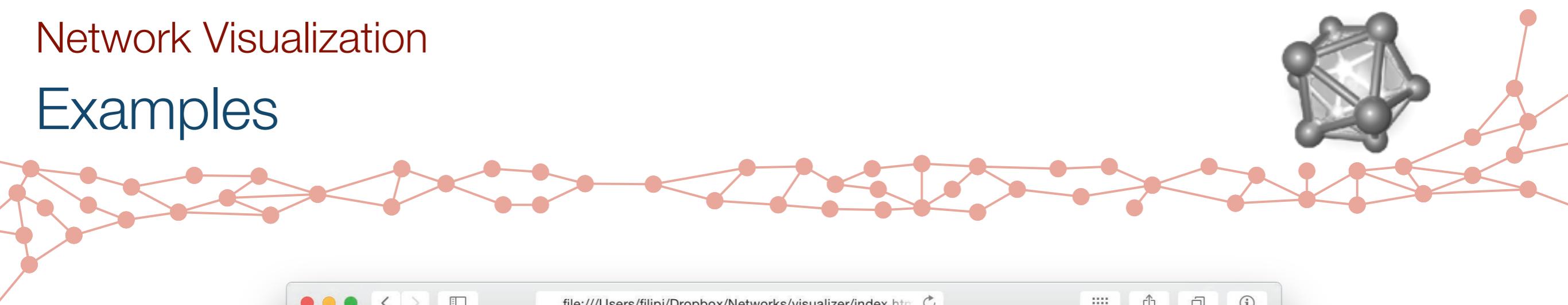
- Medicine
- Engineering
- Biology
- Mathematics
- Chemistry
- Physics

Network Visualization Examples



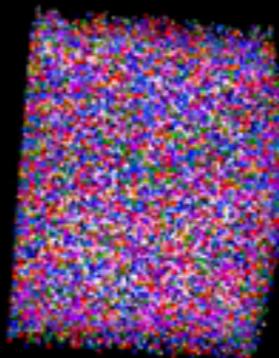
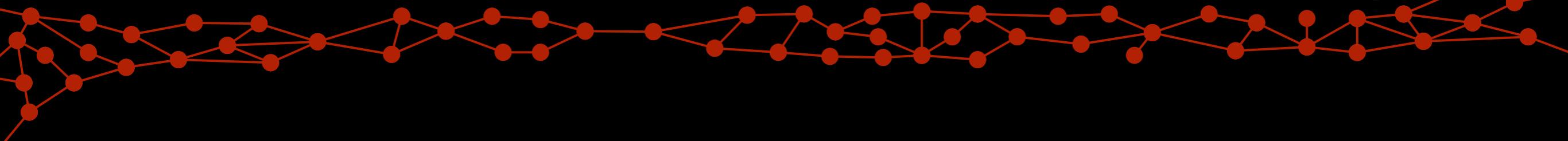
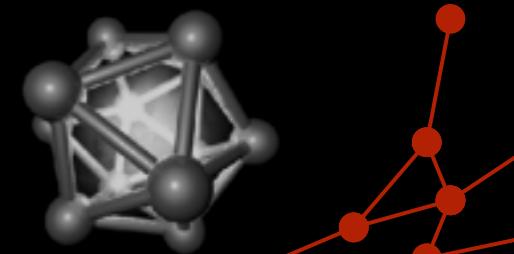
Software Interface

Network Visualization Examples

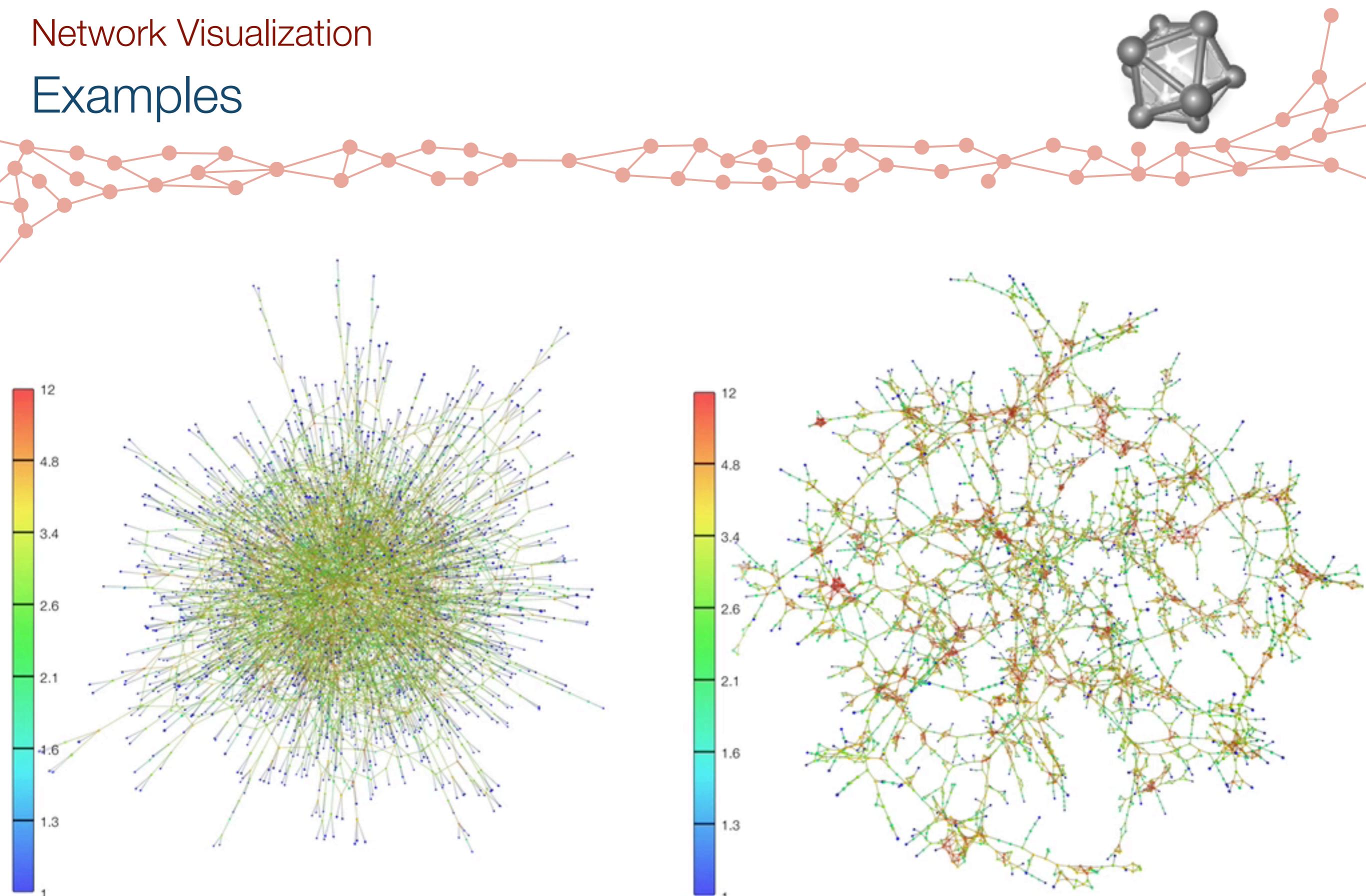


Web interface

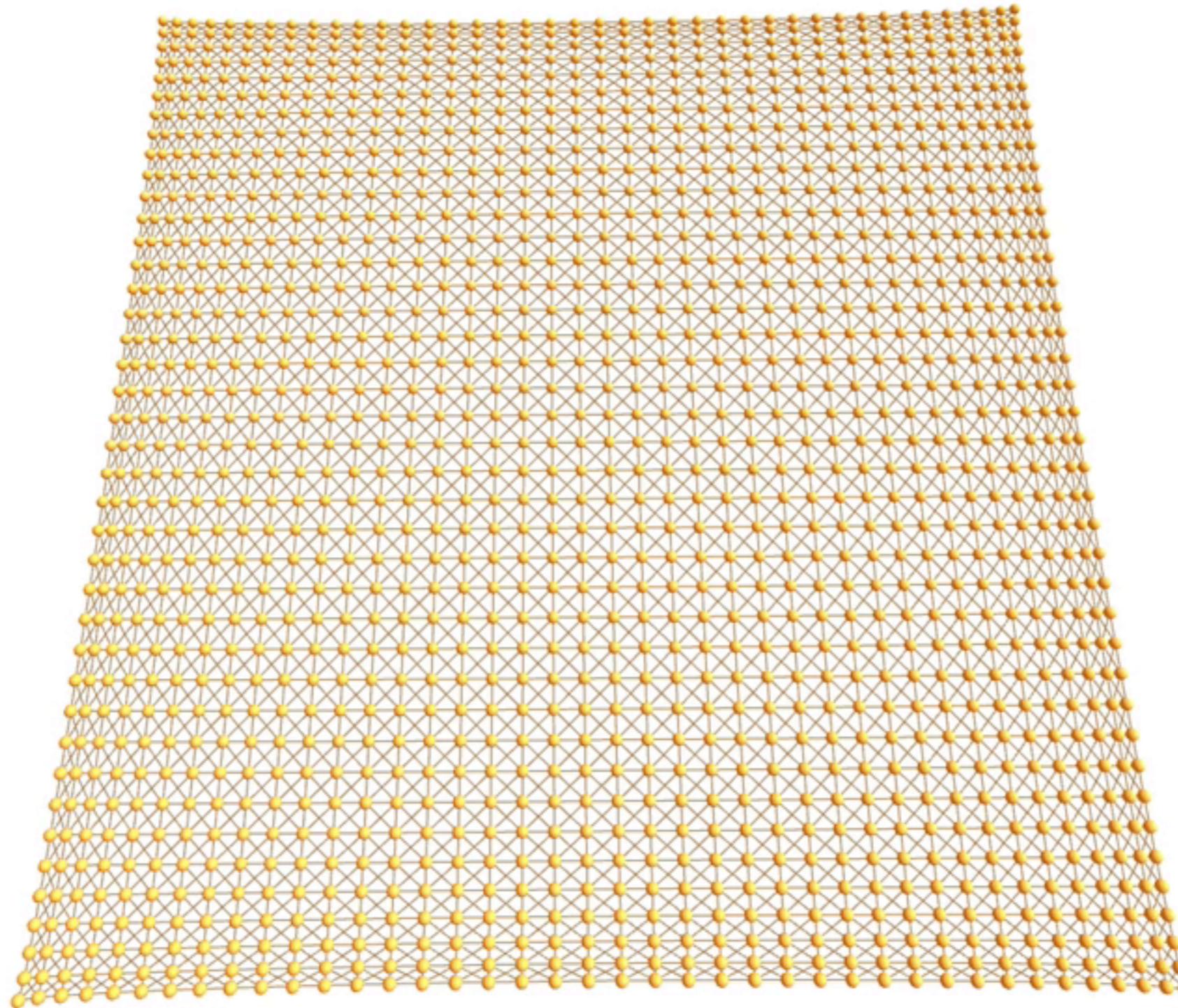
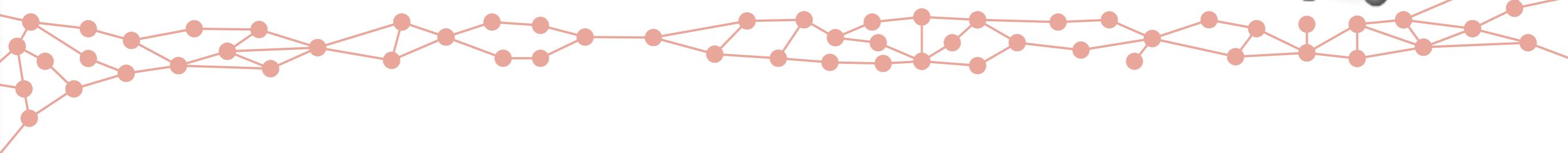
Network Visualization Examples



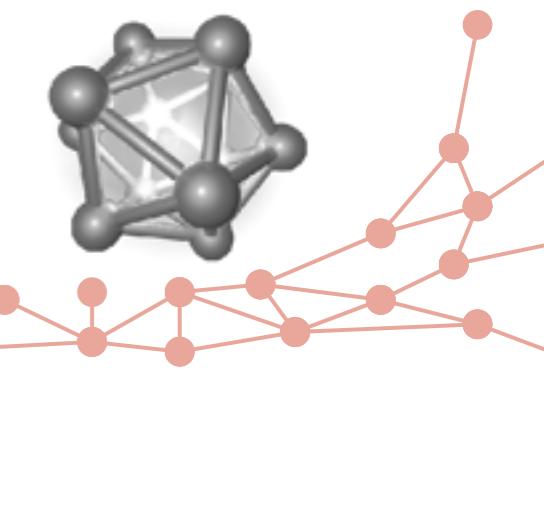
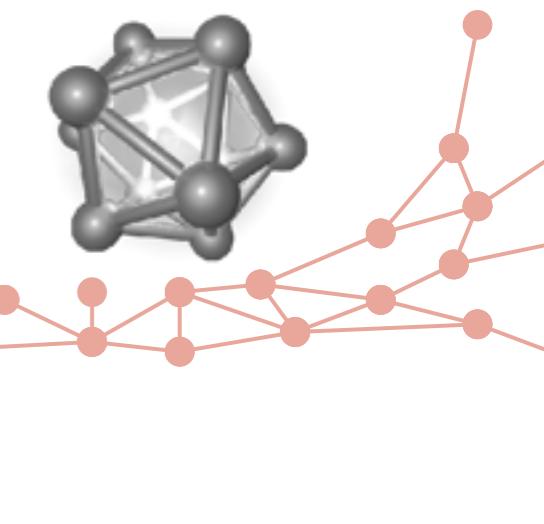
Network Visualization Examples



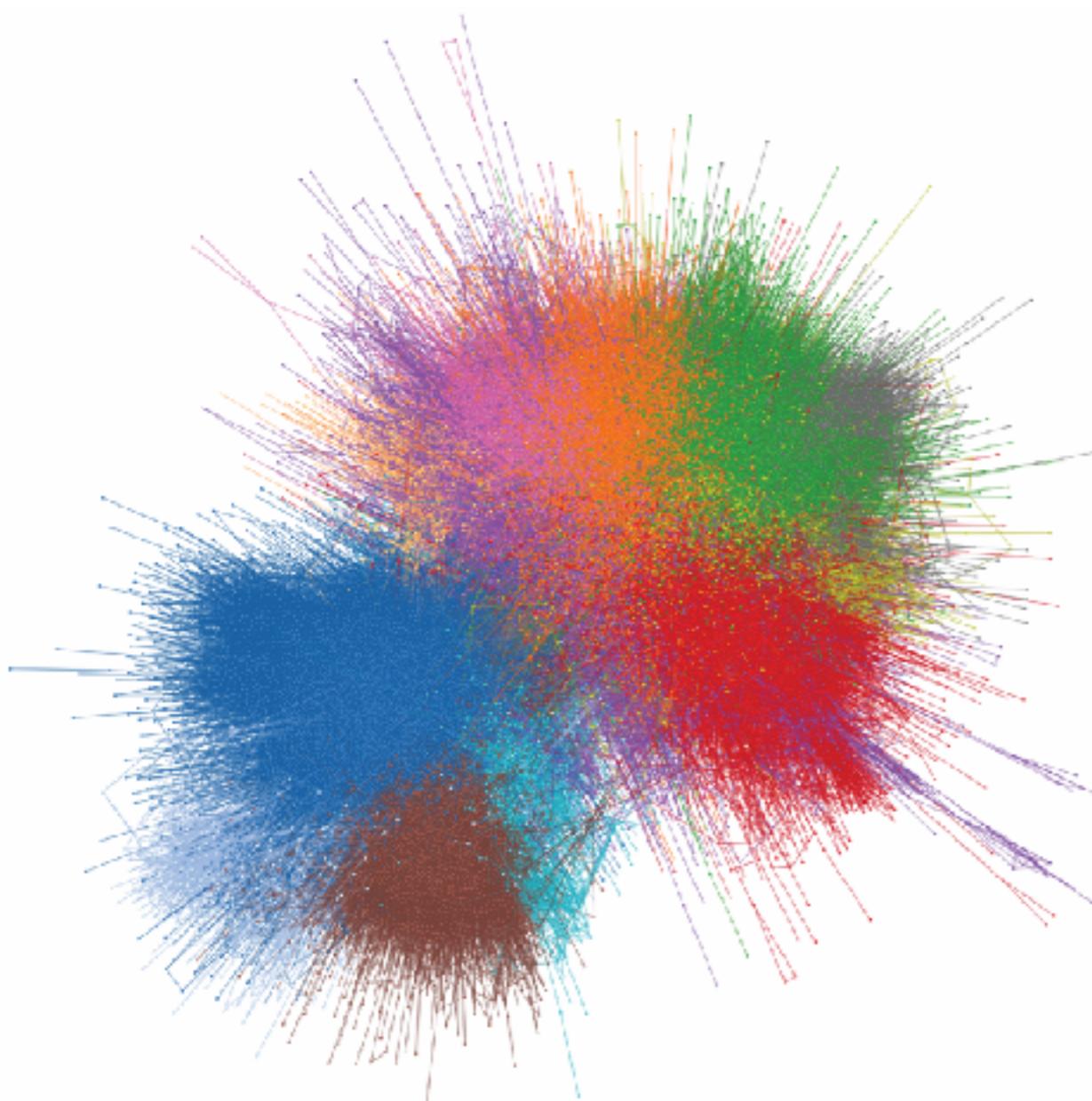
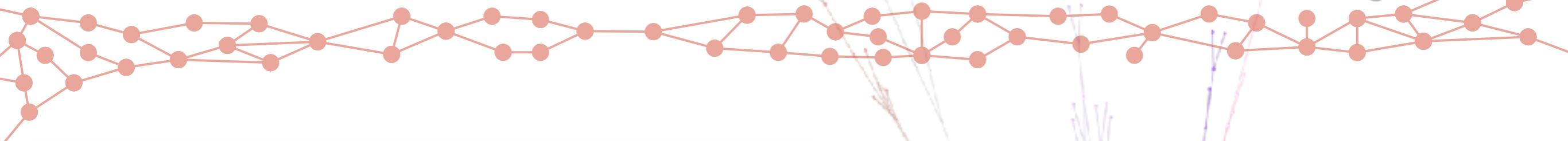
Network Visualization Examples



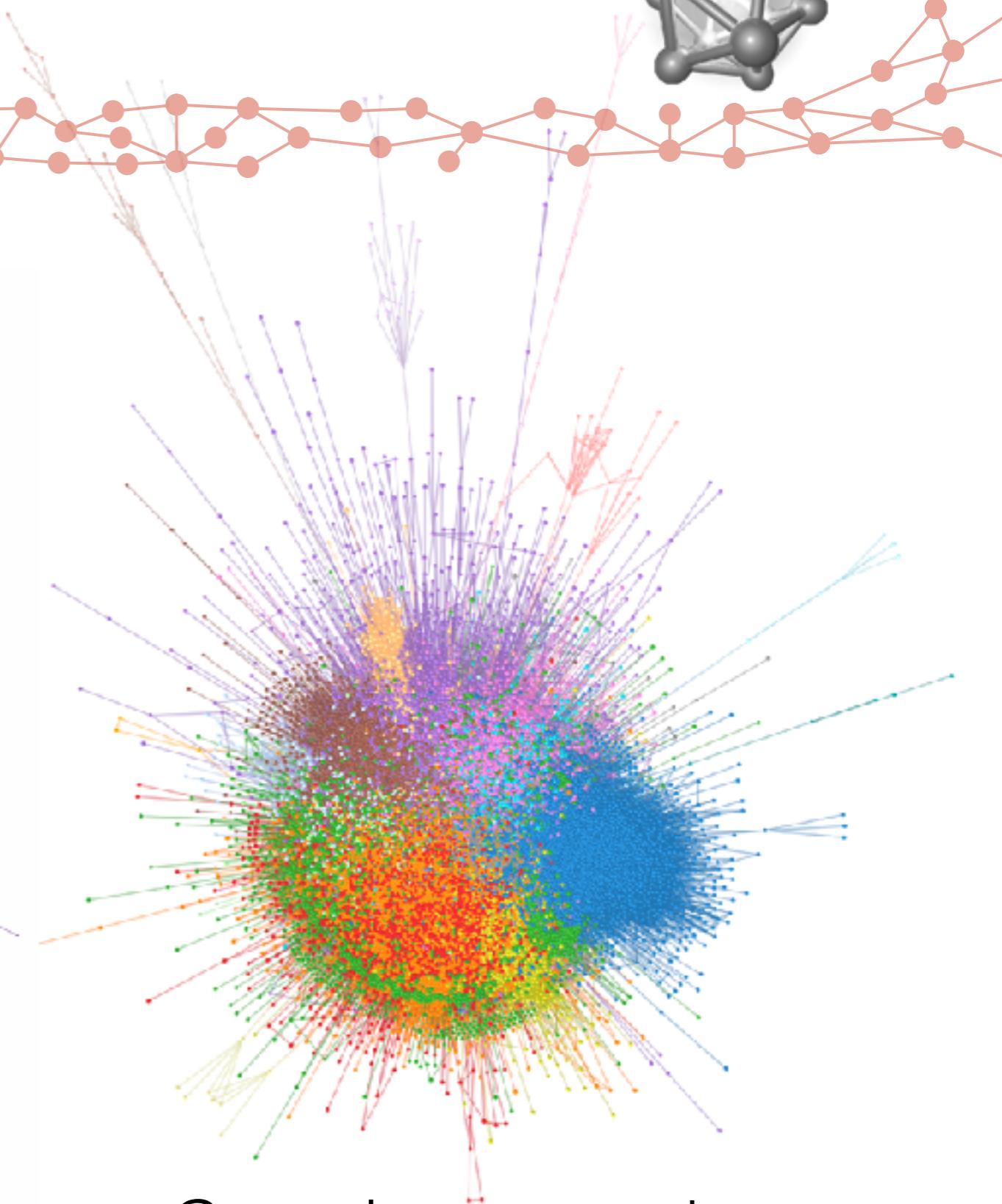
Network Visualization Examples



Network Visualization Examples



Photonic crystals



Complex networks