



POLITECNICO DI TORINO
I Facoltà di Ingegneria
Corso di Laurea Specialistica in Ingegneria Aerospaziale

A complex network approach for the analysis of turbulent flows.

Application to homogeneous isotropic turbulence.

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Turbulence

Natural phenomena:

- Atmospheric currents
- Oceanic currents
- Lava flows
- Arterial blood flows

Industrial applications:

- Aerospace
- Automotive
- Chemistry

Turbulence is a common phenomenology which is:

- Random
- Three-dimensional and multi-scale
- Irregular
- Unsteady
- Unpredictable

Turbulence studies: DNS (LES, RANS), statistical approach, energy spectrum, experimental approach



Objectives:

- Better spatial characterization
- Behavior of Taylor's and Kolmogorov's scales
- Complementary approach
- Gaining synthetic informations from a multipoint analysis

Turbulence is a complex system, therefore it may be studied with the complex network theory



Johns Hopkins Turbulence Databases (JHTDS)

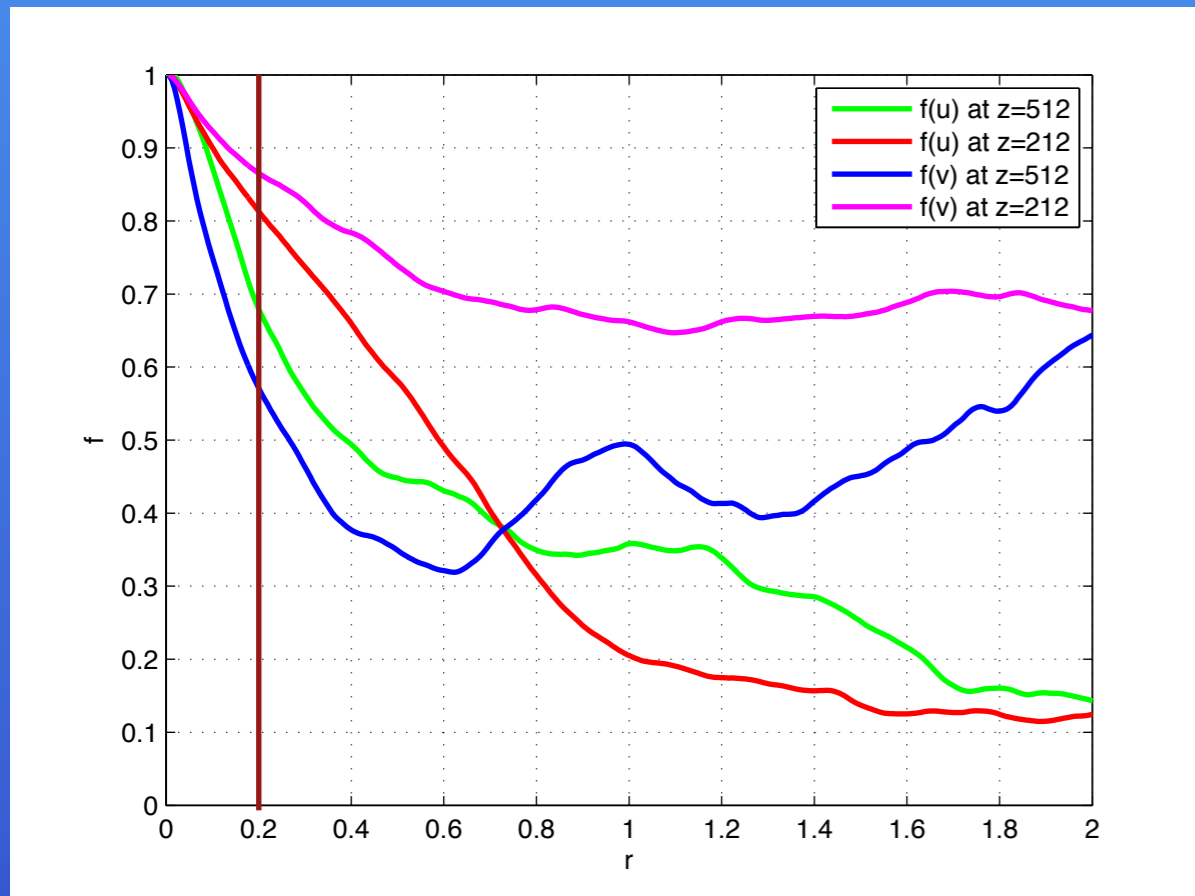
<http://turbulence.pha.jhu.edu>

Forced isotropic turbulence:

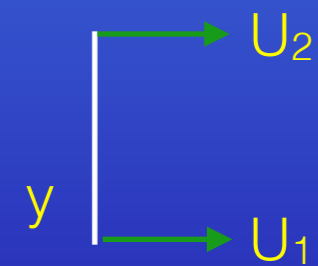
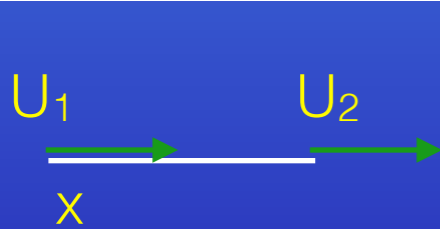
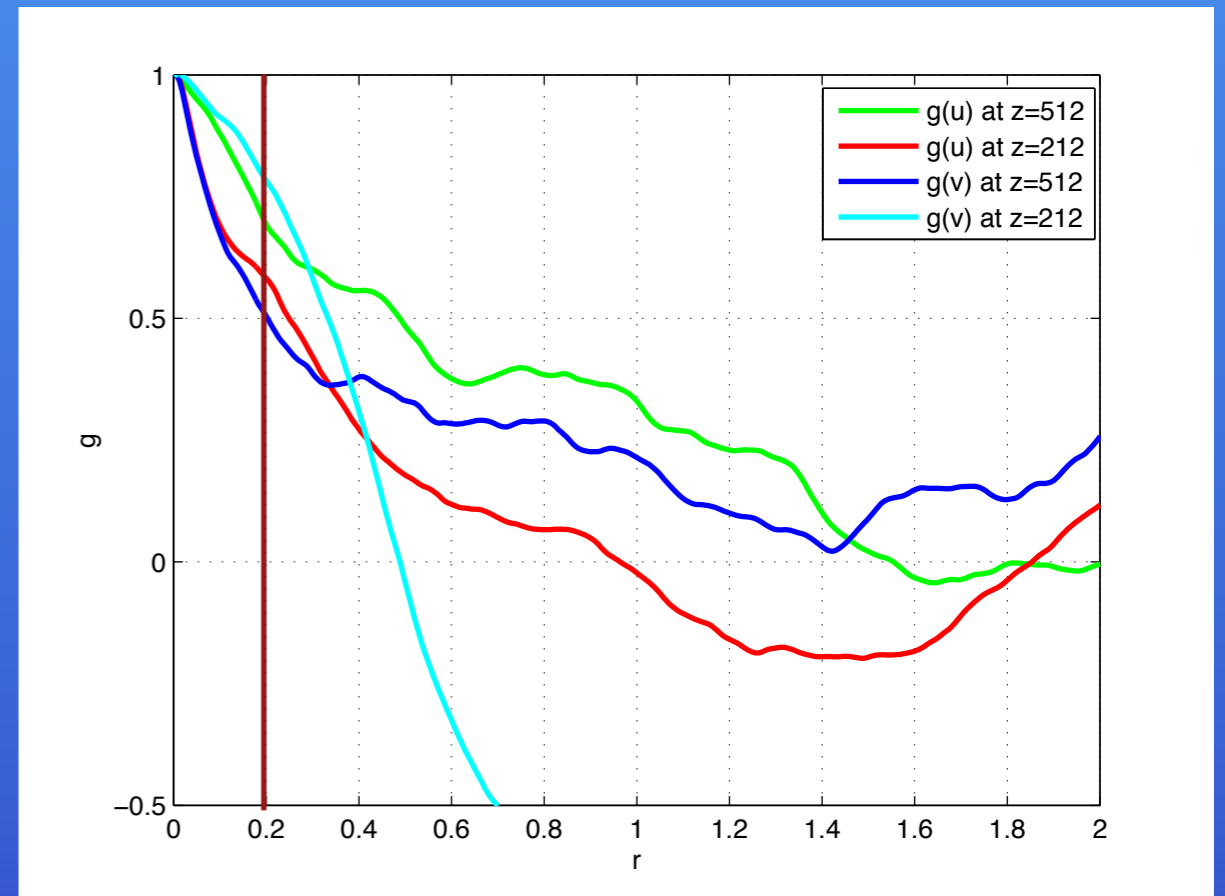
- DNS of 1024^3 nodes, $Re_\lambda = 433$
- Energy injected by keeping constant total energy
- Storage of data after reaching stationary state
- 1024 time steps from 0 to 2.048
- Duration of stored data of about one large eddy turnover: $T_L = 2.02$
- Domain: $2\pi \times 2\pi \times 2\pi$
- Kolmogorov scale $\eta = 0.00287$
- Inerire scala Taylor $\lambda = 0.118$
- Integral scale $L = 1.376$

Validation of the dataset: isotropic scaling

- Longitudinal autocorrelation function



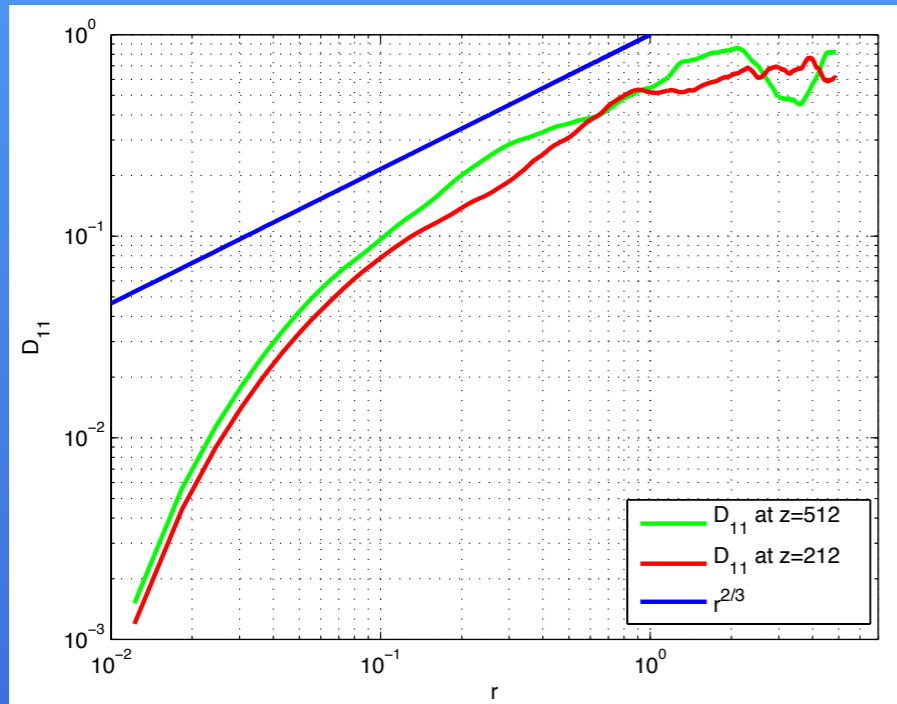
- Transverse autocorrelation functions



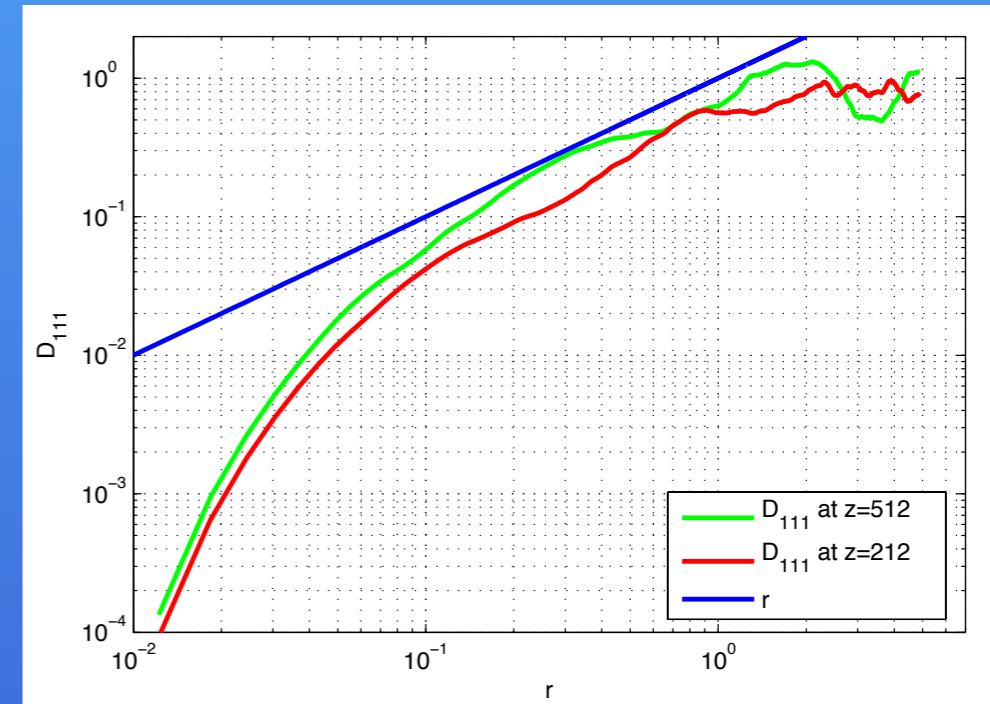
- Isotropy at small scales
- Divergence for bigger r (a bigger number of sample may be used)

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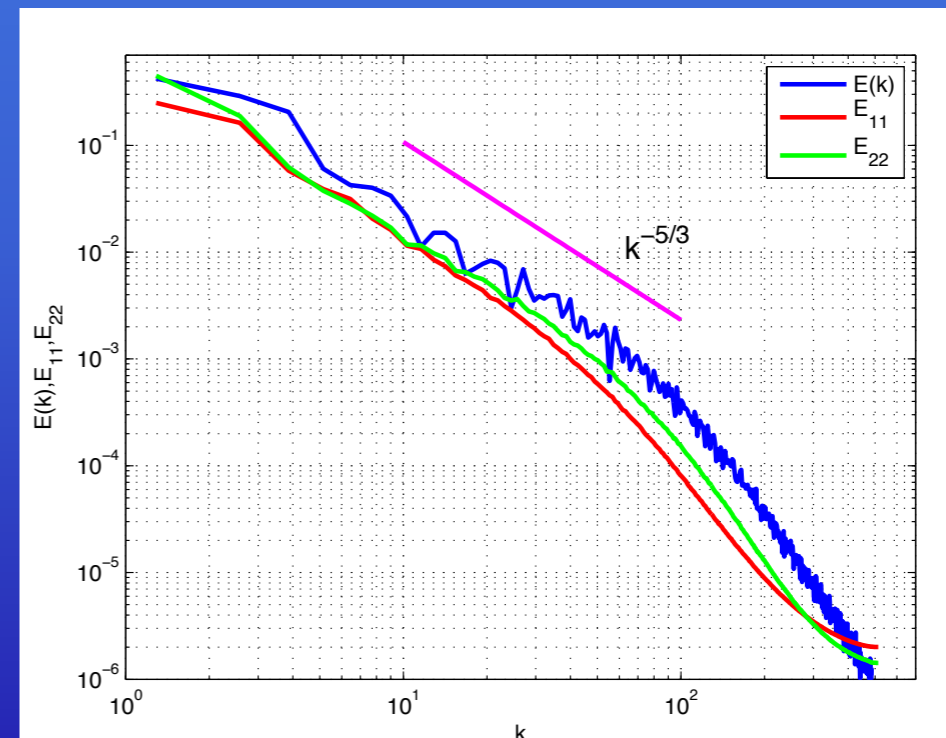
- Second-order structure functions



- Third-order structure functions



- Spectral analysis (1D, 3D)





Graph theory

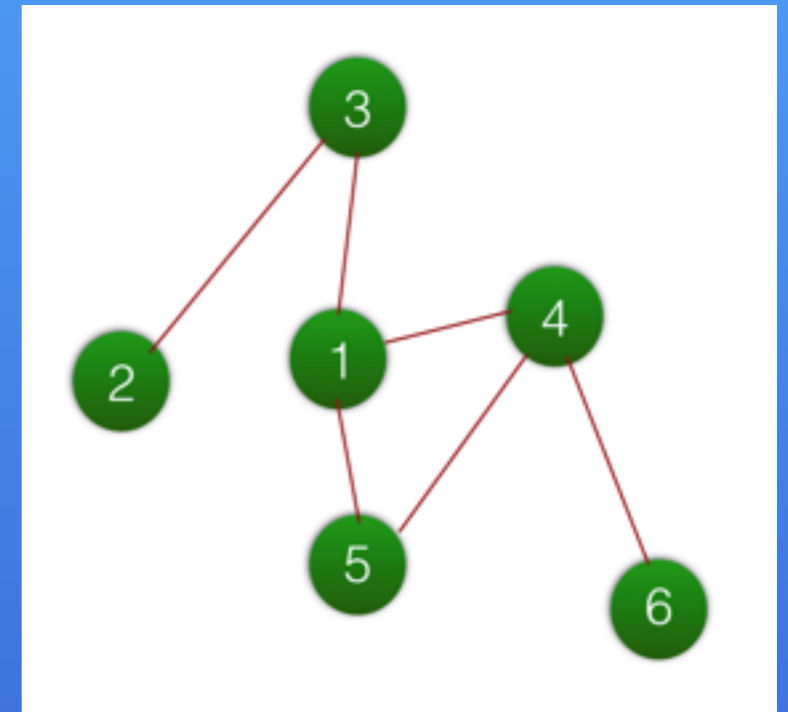
Statistic physics

Complex network theory

- 20th century
- Still developing at fast pace
- Contributing to different fields of study
- Gaining contribution from different fields of study

Sociology (Milgram's 6 degrees of separation), Biology, Medicine (Cancer's spreading), Communications (WWW), Economy, Climatology, Earth Science (Earthquakes), Engineering (Transports)

Nodes and links form a network



$$a_{ij} = \begin{cases} 1 & \text{if } i \text{ and } j \text{ are linked} \\ 0 & \text{if } i \text{ and } j \text{ are not linked} \end{cases}$$

- Degree centrality
- Weighted average topological distance

$$k_i = \frac{\sum_{j=1}^N a_{ij}}{N-1}$$

$$\bar{D}_i = \frac{\sum_{j \in nn(i)} d_{ij}}{N_{ci}} \frac{N-1}{N_{ci}}$$

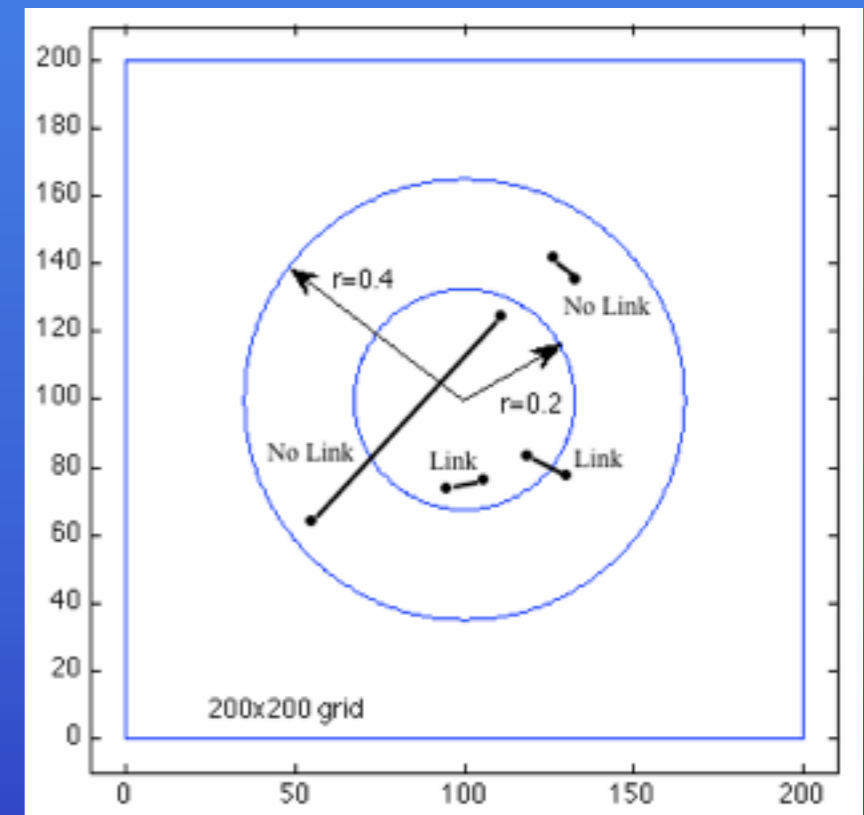
- Betweenness centrality
- Local clustering coefficient

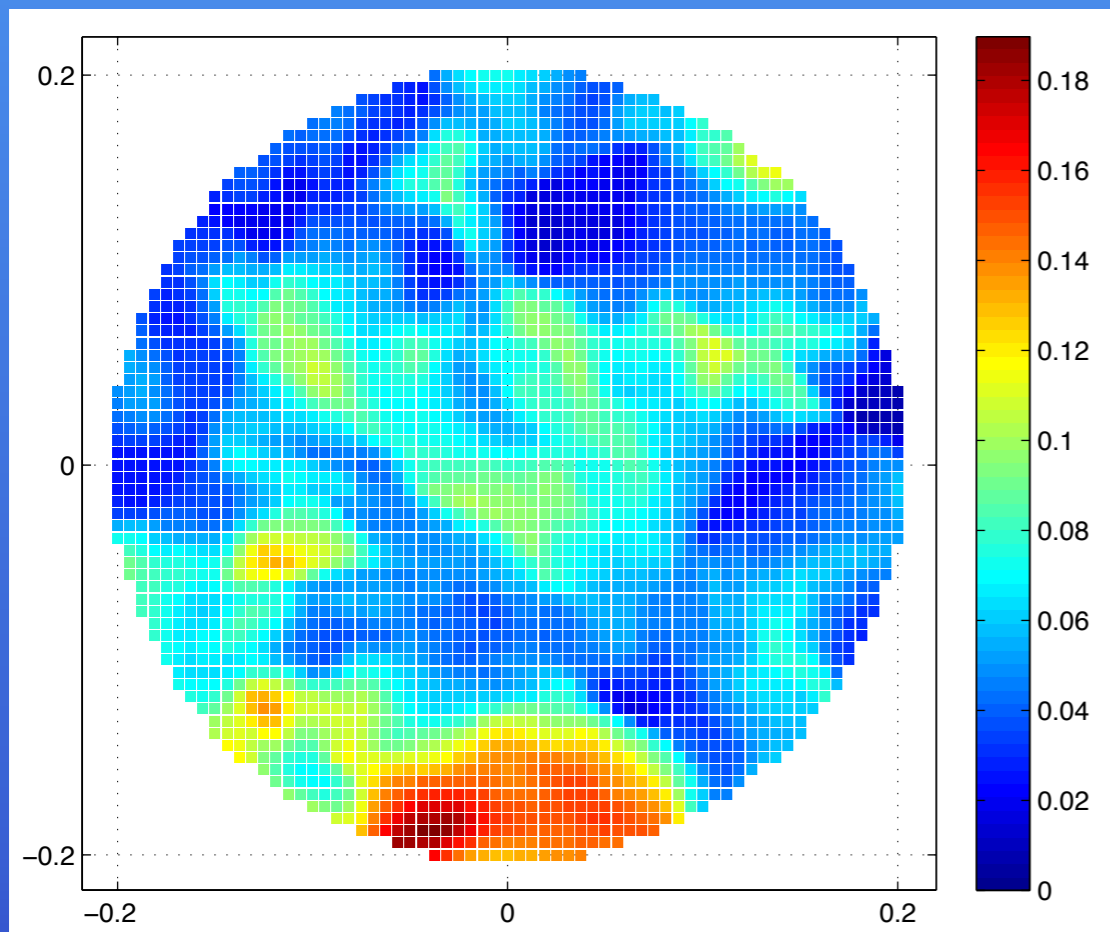
$$BC_k = \sum_{i,j \neq k} \frac{\sigma_{ij}(k)}{\sigma_{ij}}$$

$$C_i = \frac{e(\Gamma_i)}{\frac{k_i(k_i-1)}{2}}$$

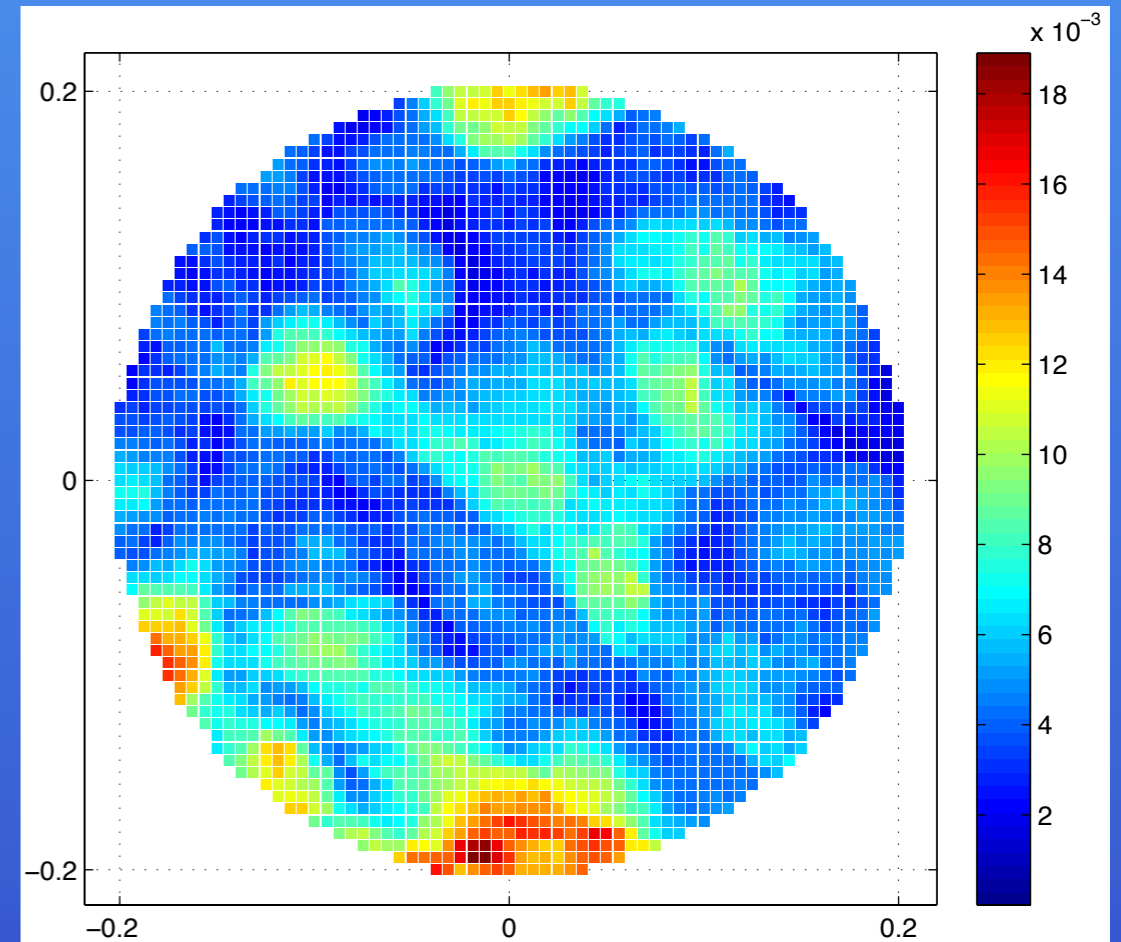
Building the network

- Two 800x800x1 grids ($z=212,512$)
- 160 circumferences, $r = 0.4$, 13333 nodes
- Temporal correlation R_{ij} between nodes of every circumference
- Threshold value $\tau = 0.5, 0.9$
- A link between nodes i and j occur if:
 - $R_{ij} > \tau$
 - At least one between nodes i and j lies inside the circumference with ray $r=0.2$
 - The physical distance between nodes i and j is less or equal to 0.2
- Same potential number of links for every node
- Focus on a circumference of ray $r = 0.2$, doubling the Taylor's scale



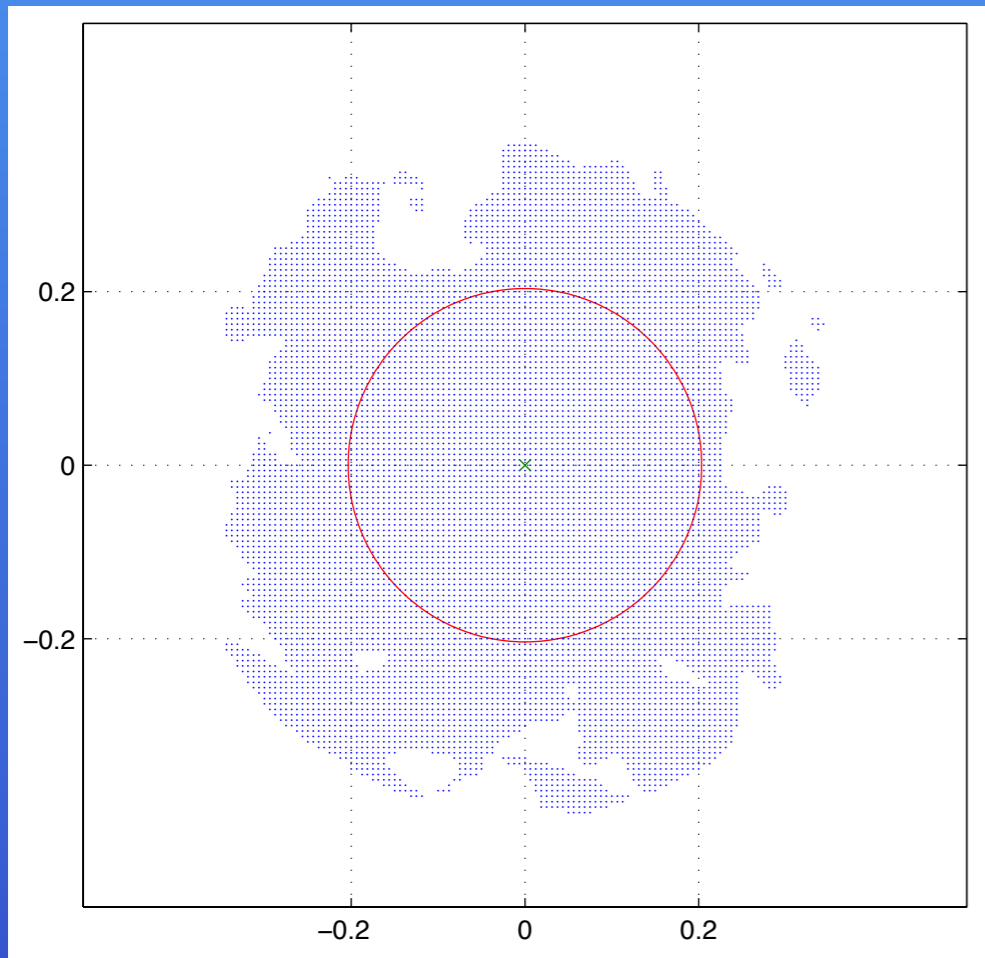
Circumference (200,600) at $z=512$ $\tau=0.5$ 

9378 nodes, 1313722 links

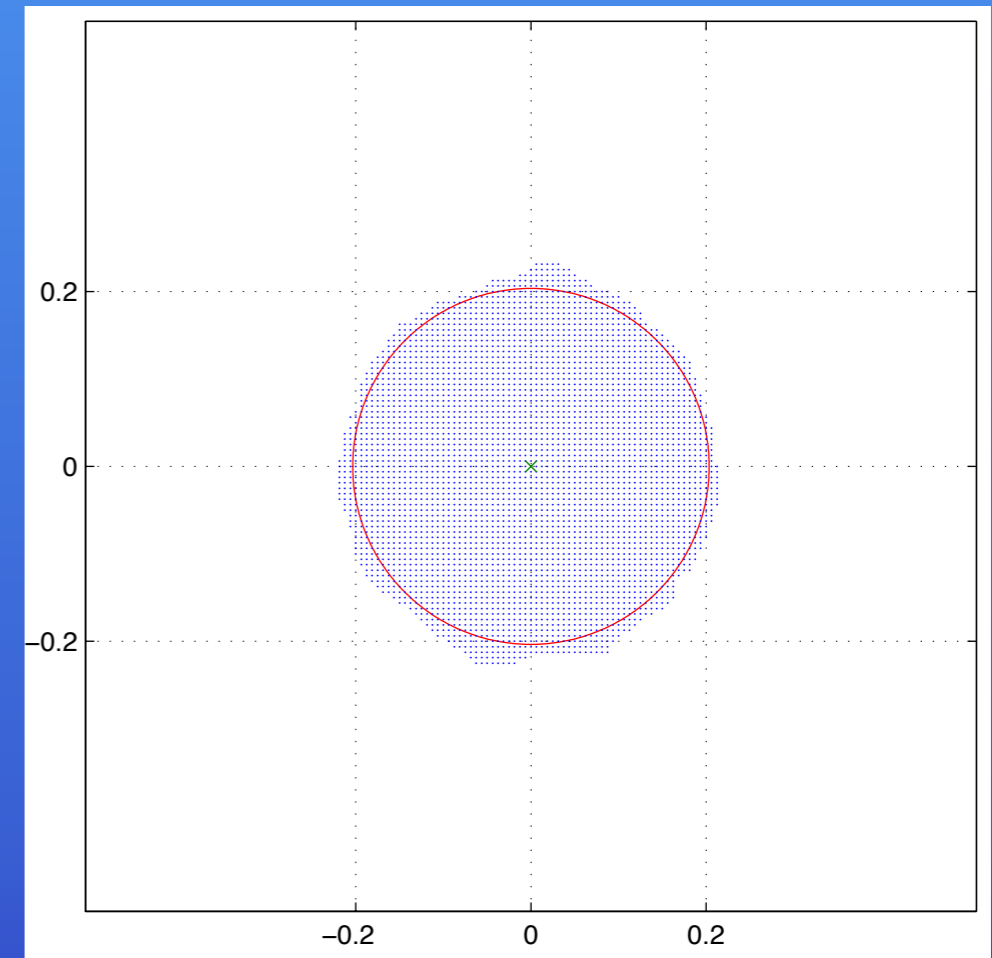
 $\tau=0.9$ 

3862 nodes, 38770 links

- Same pattern, different values of the degree centrality
- Structures more extended in space

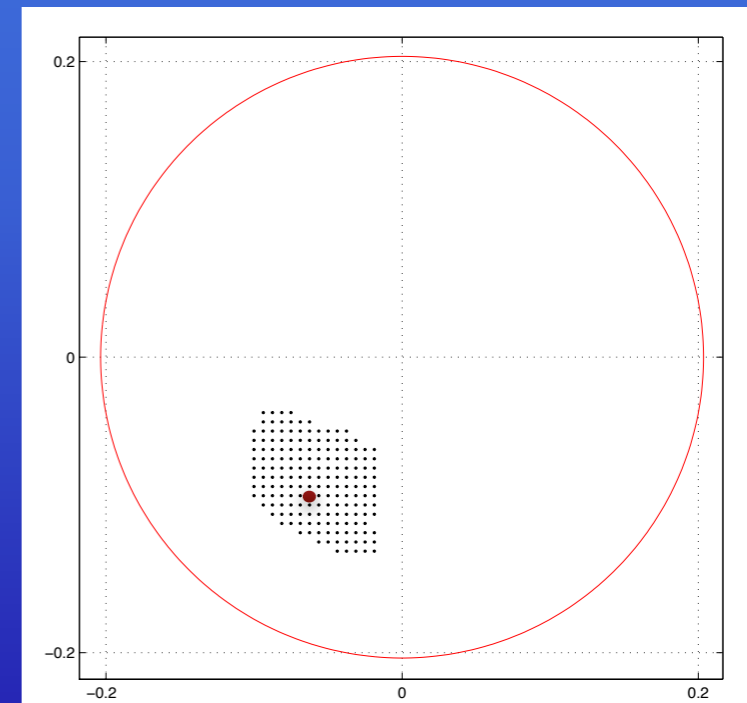
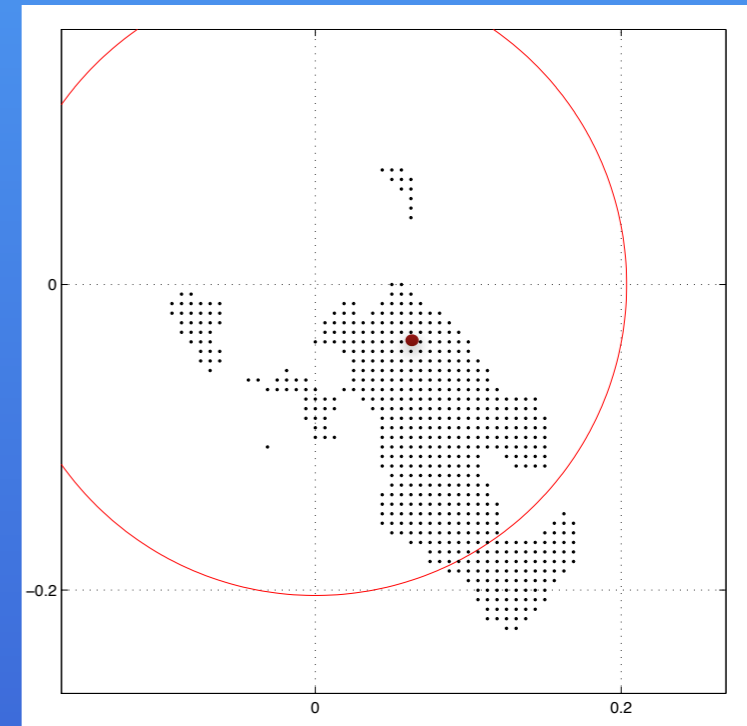
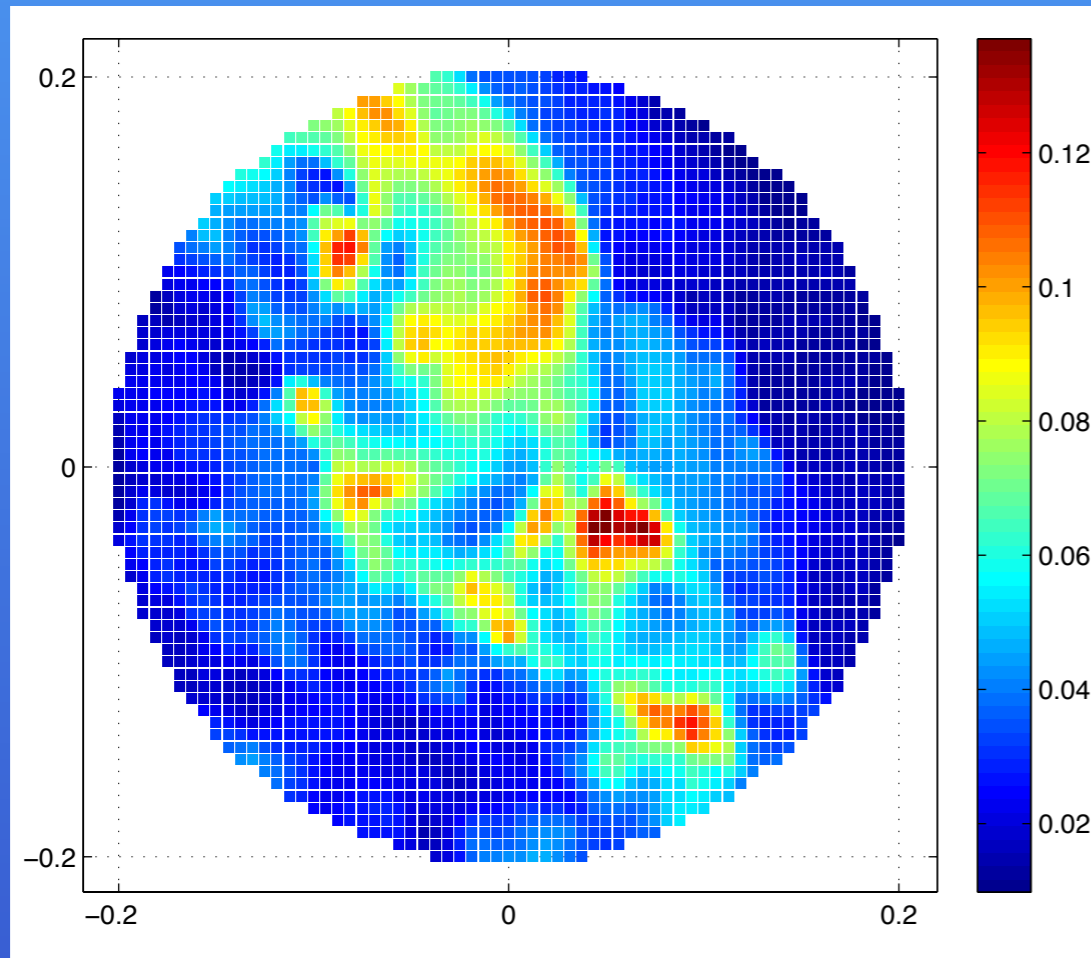
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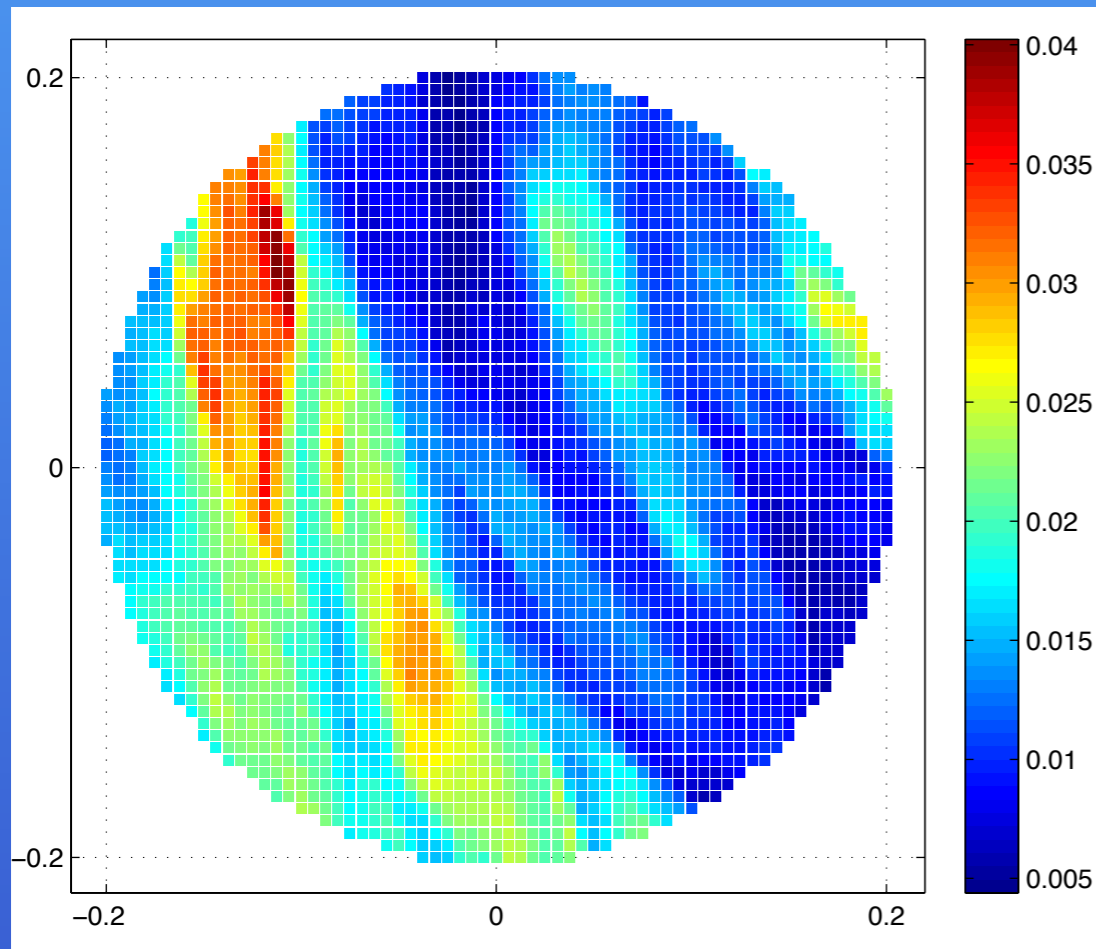
- Same pattern, different values of the degree centrality
- Structures more extended in space

Circumference (110,350) at $z=212$, $\tau=0.9$ 

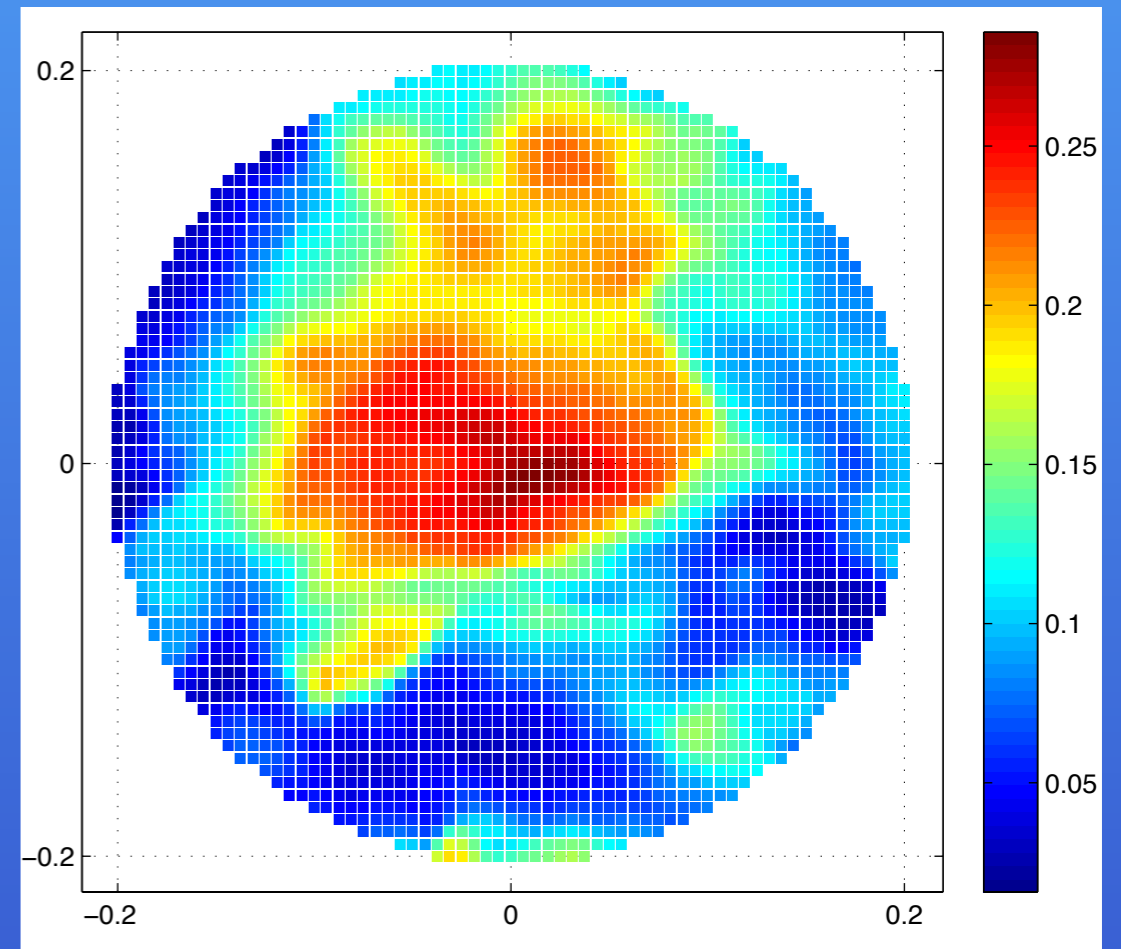
- Nodes 120,344 and 100,335
- Correlation trend different in every direction
- Directional biases lost in 100,335 node

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Circumference (390,470) at $z=212$, $\tau=0.9$



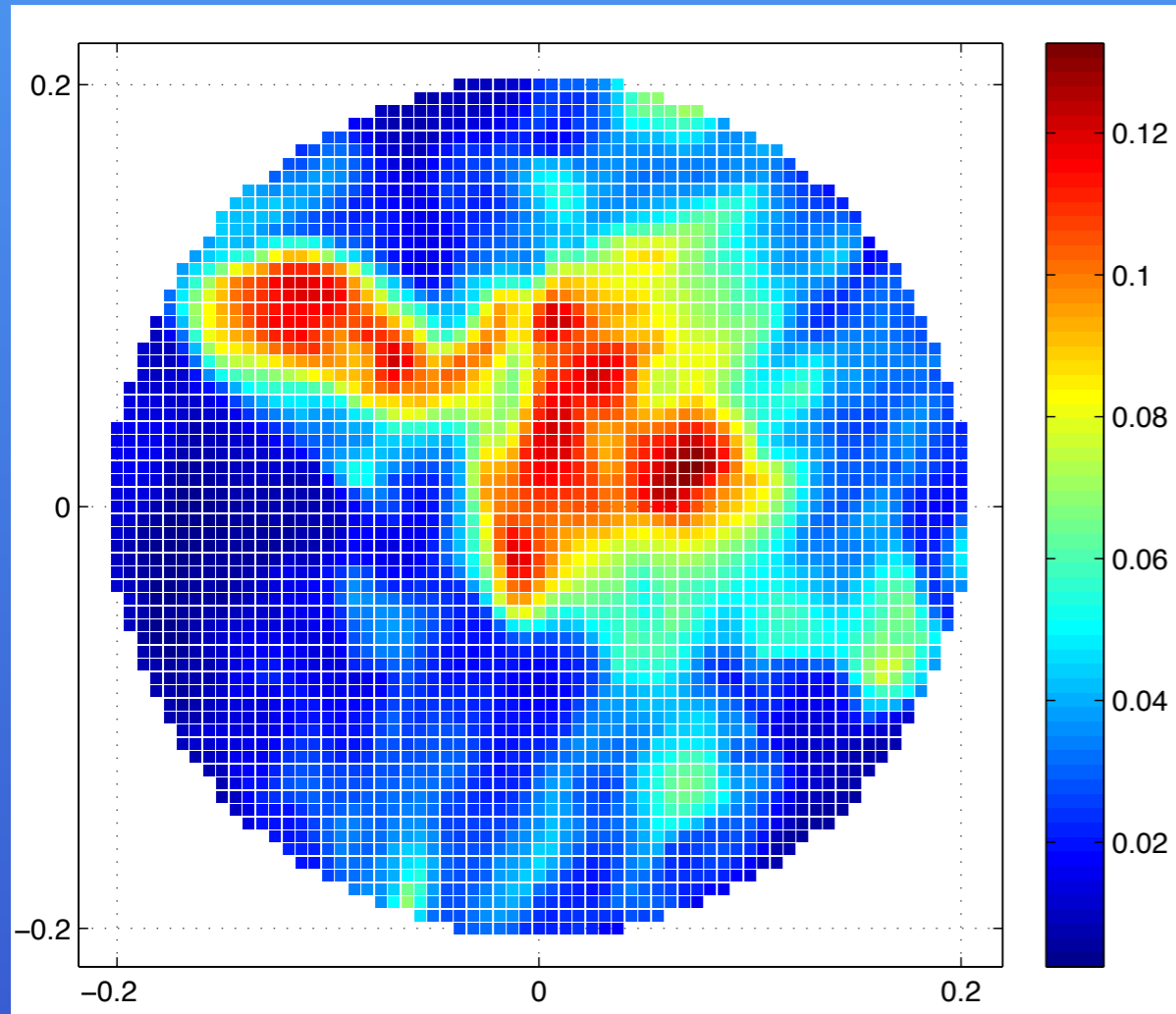
Circumference (510,430) at $z=212$, $\tau=0.9$



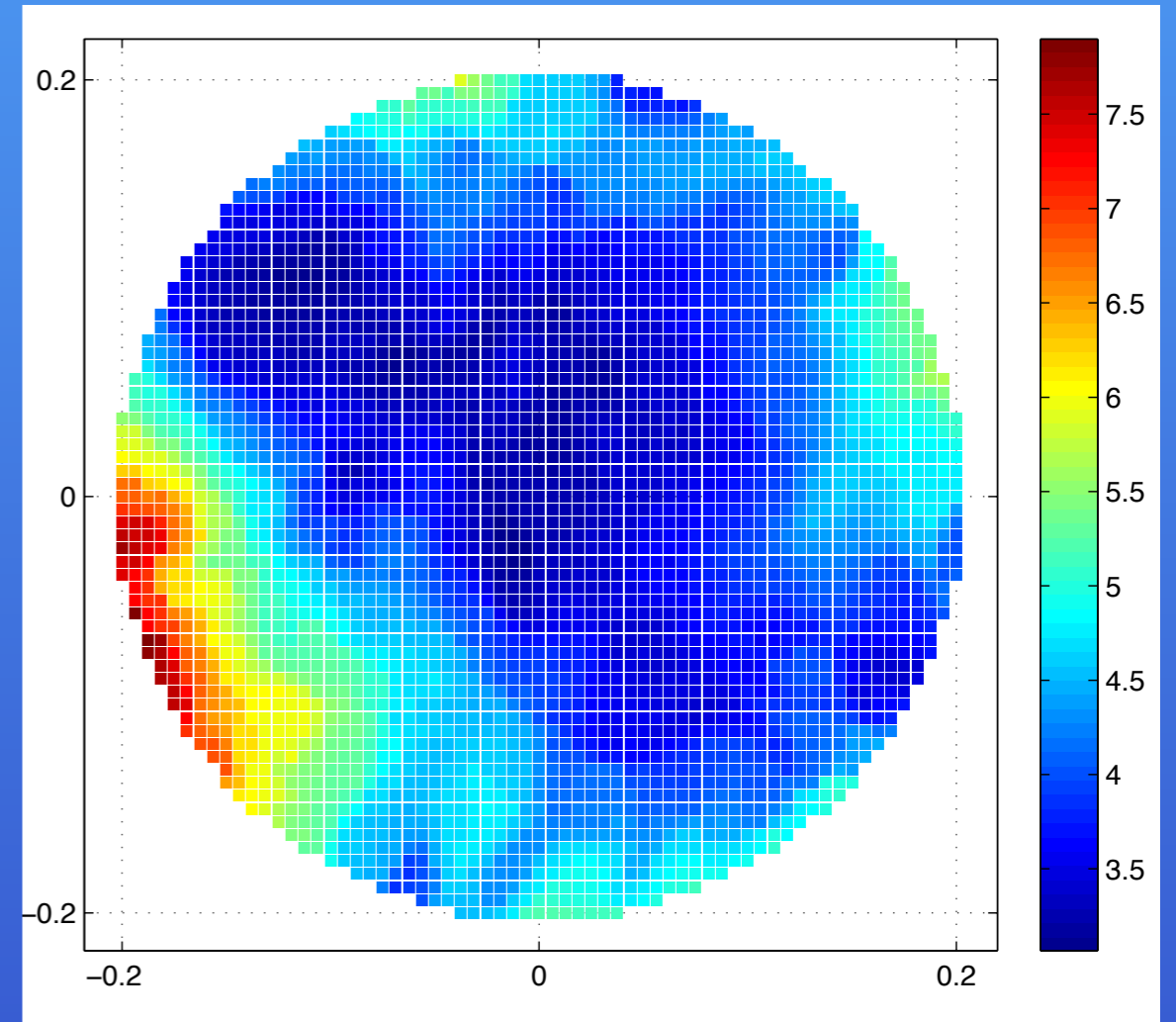
- Spatial homogeneity in less correlated networks
- Streaky pattern typical of networks with a medium value of the degree centrality
- Streaky pattern breaks down in presence of highly correlated nodes

Circumference (280,280) at $z=512$, $\tau=0.9$

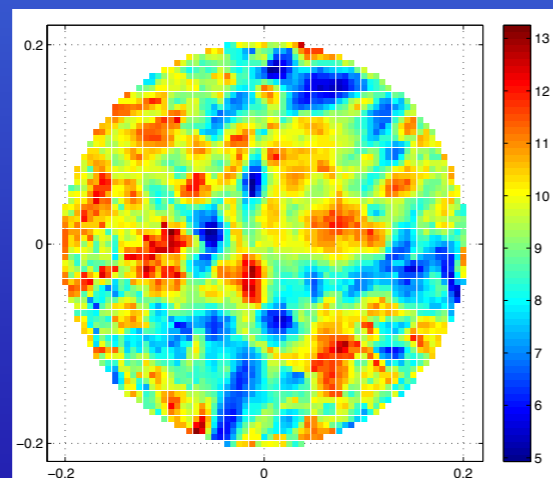
Degree Centrality



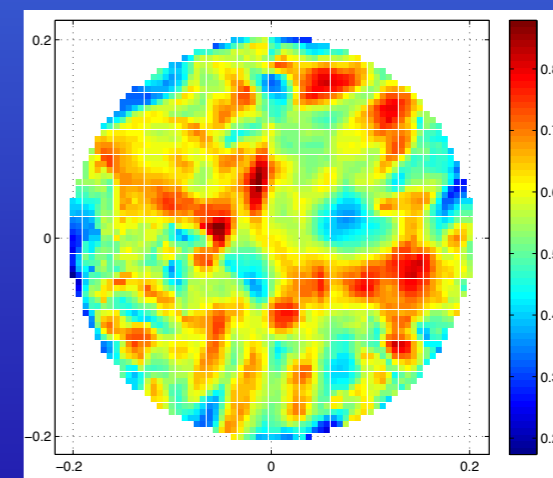
Weighted Average Topological Distance



Betweenness Centrality

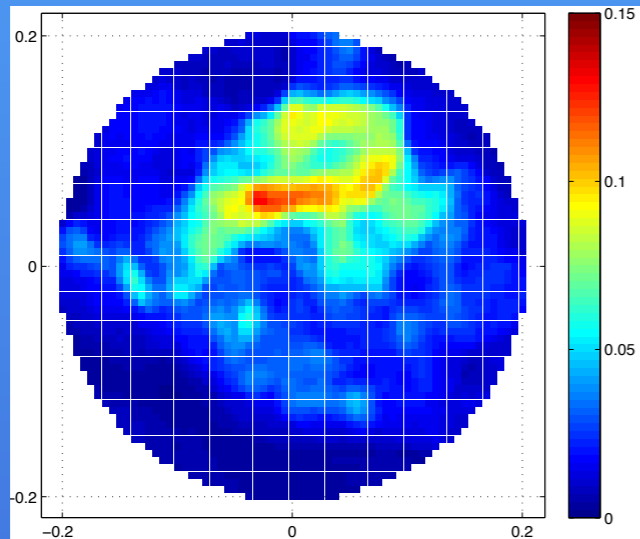


Local Clustering Coefficient

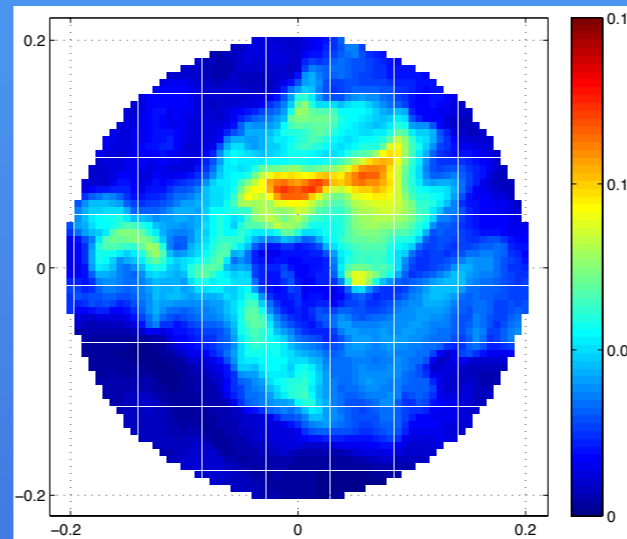


Circumference (280,280), evolution in the z direction

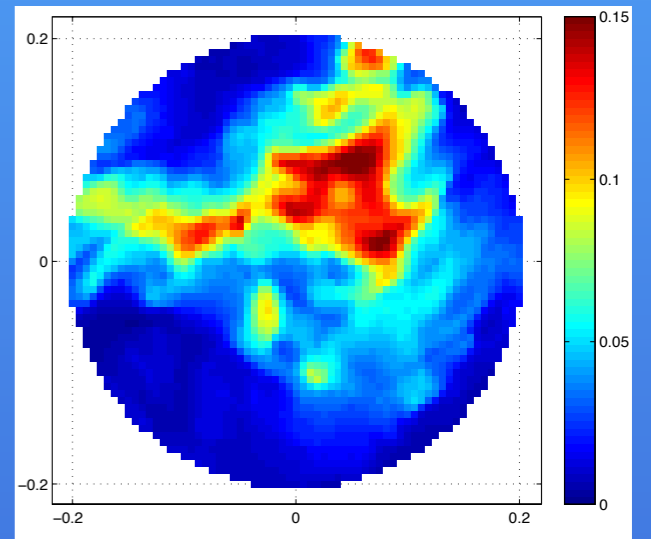
z=492



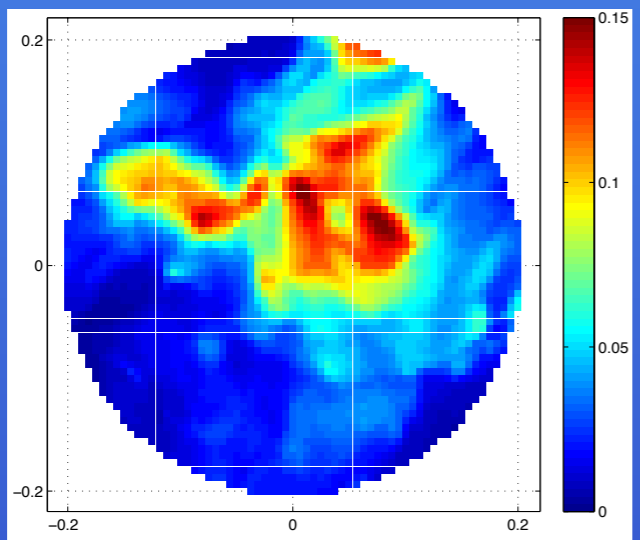
z=497



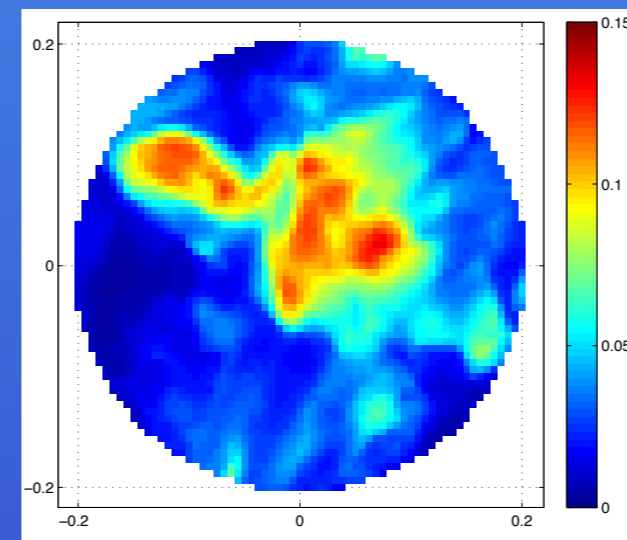
z=502



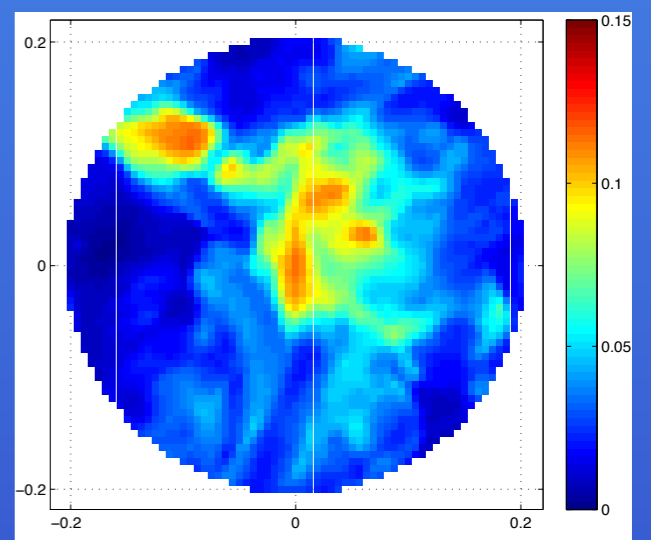
z=507



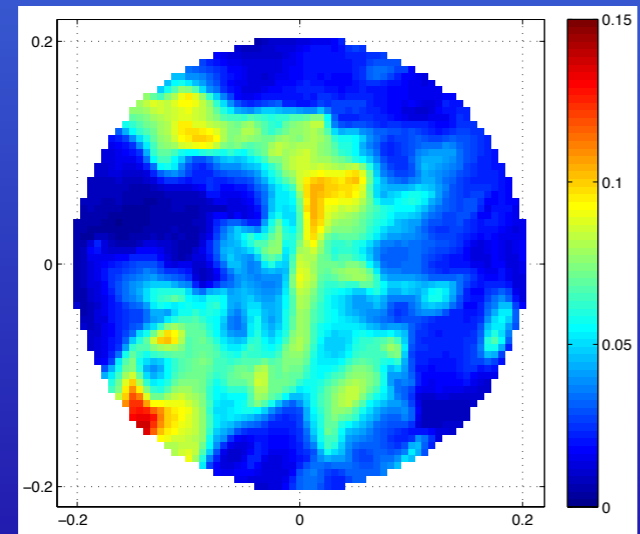
z=512



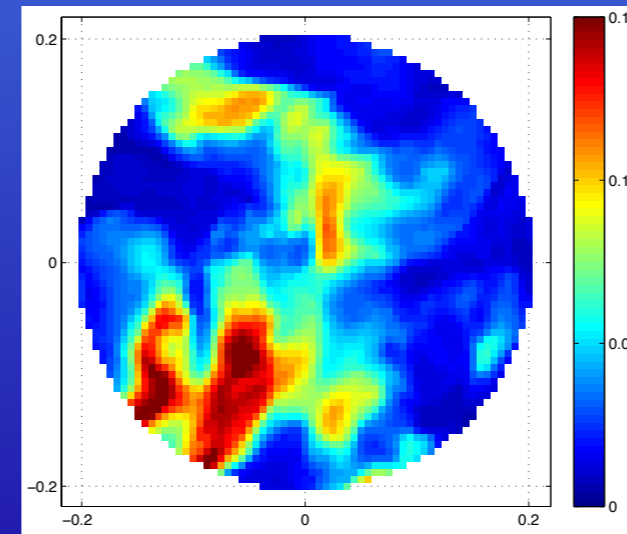
z=517



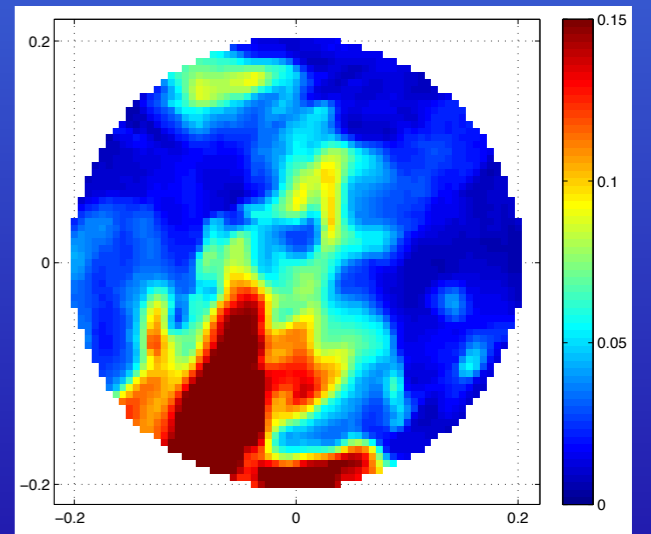
z=522



z=527

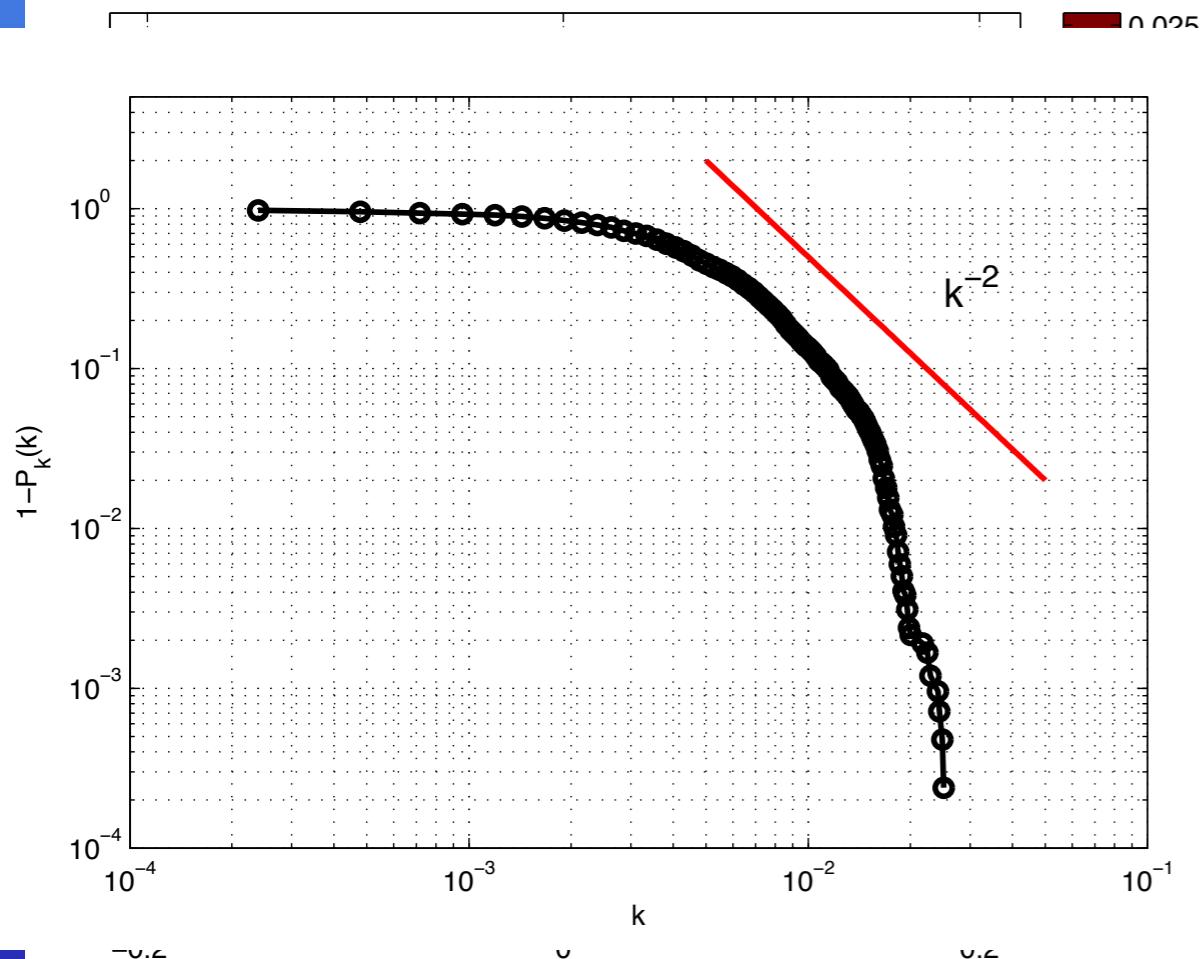


z=532

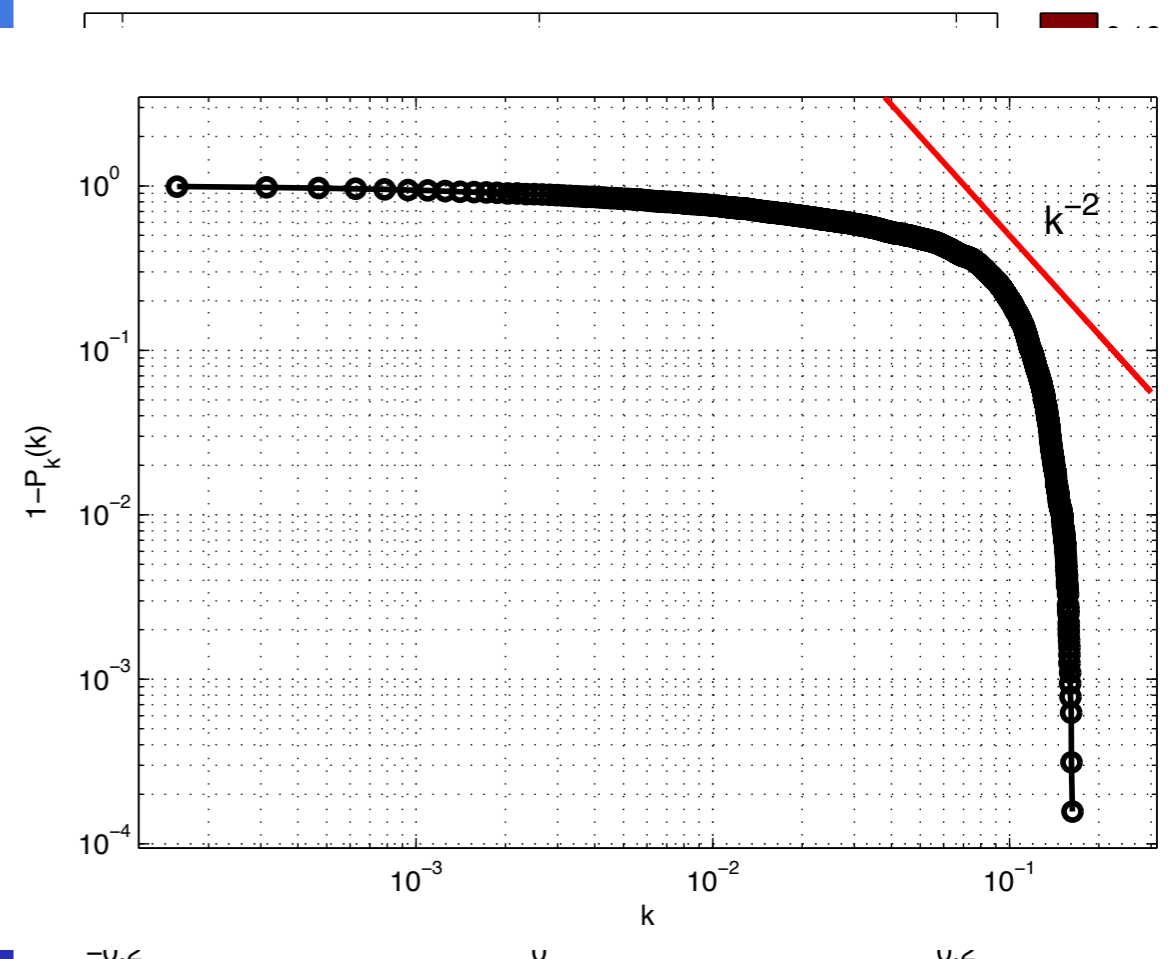


Power-law degree distribution

- Scale-free networks: power law distribution having the same form at all scales
- Real networks are scale-free: few of the nodes are highly correlated while the rest of the network is barely correlated
- Power law ranging from -2 to -3



Circumference (150,230) at $z=512$



Circumference (730,410) at $z=212$



Conclusions:

- This turbulent flow shows all the characteristics of a complex network
- The complex network theory may be a complementary approach for the study of turbulence
- Degree centrality and weighted average topological distance may be useful for the spatial characterization of a turbulent flow
- Out of 160 cuts circa, at least 15-20 networks consisting of supernodes ($k > 0.15$) were found
- A highly correlated network may be associated with the presence of energetic patterns. No local isotropy and dishomogeneity

Improvements:

- Turbulence is intrinsically 3D: spherical networks
- Community structures
- Different type of flows, especially the ones with strong dishomogeneity



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Thank you for your attention.



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