



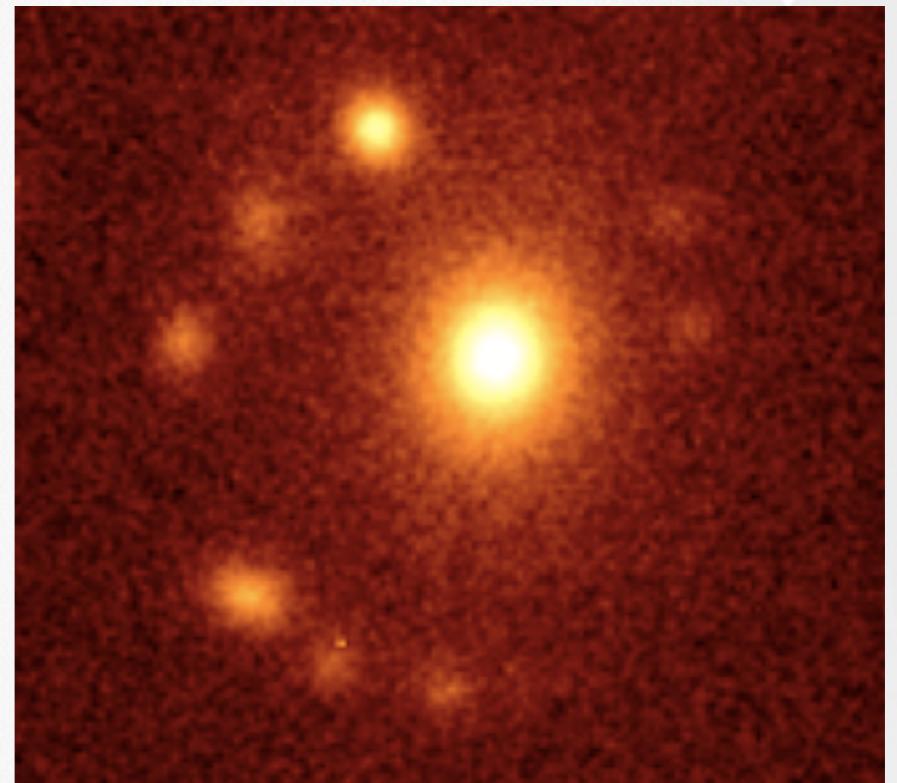
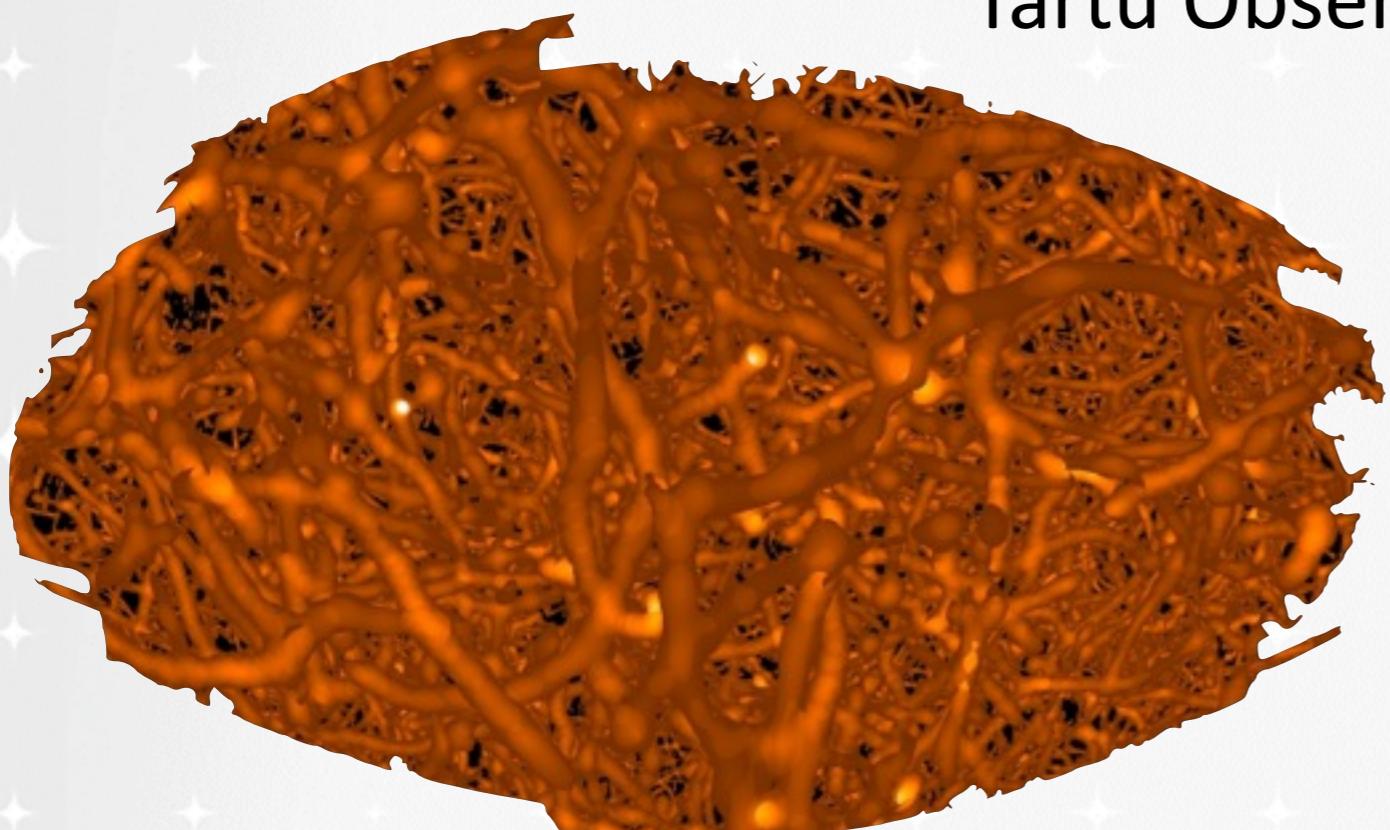
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# Detecting filamentary pattern in the cosmic web: galaxy filaments as pearl necklaces

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# Outline

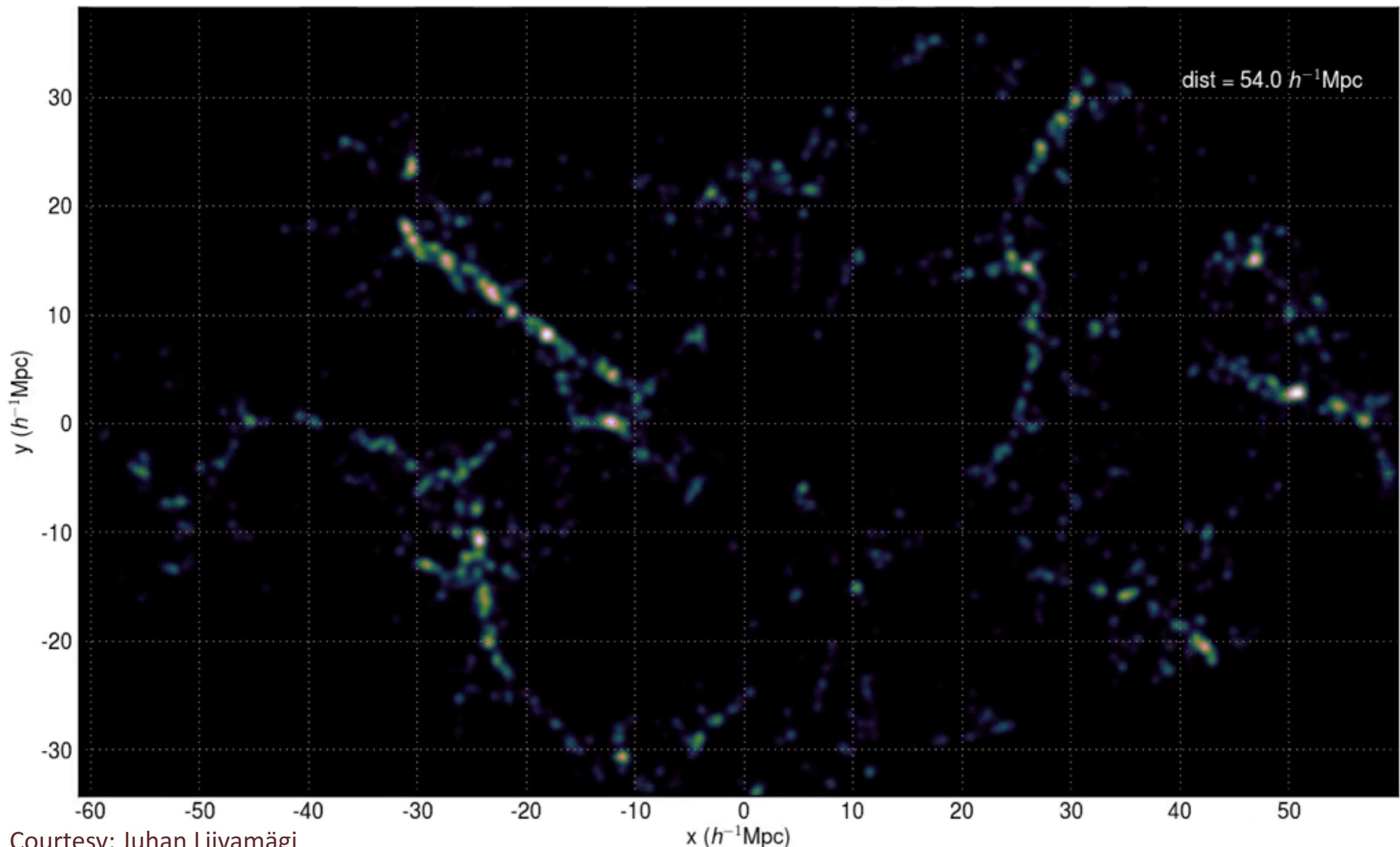
- ★ Detecting filamentary pattern spine in the galaxy distribution.  
Probabilistic approach: marked point process (Bisous model) to detect the filamentary network.  
[arXiv:1308.2533](https://arxiv.org/abs/1308.2533) “Detecting filamentary pattern in the cosmic web: a catalogue of filaments for the SDSS”
  
- ★ The distribution of galaxies along galaxy filaments to search for regularities in galaxy and group distributions.  
[arXiv:1406.4357](https://arxiv.org/abs/1406.4357) “Galaxy filaments as pearl necklaces”



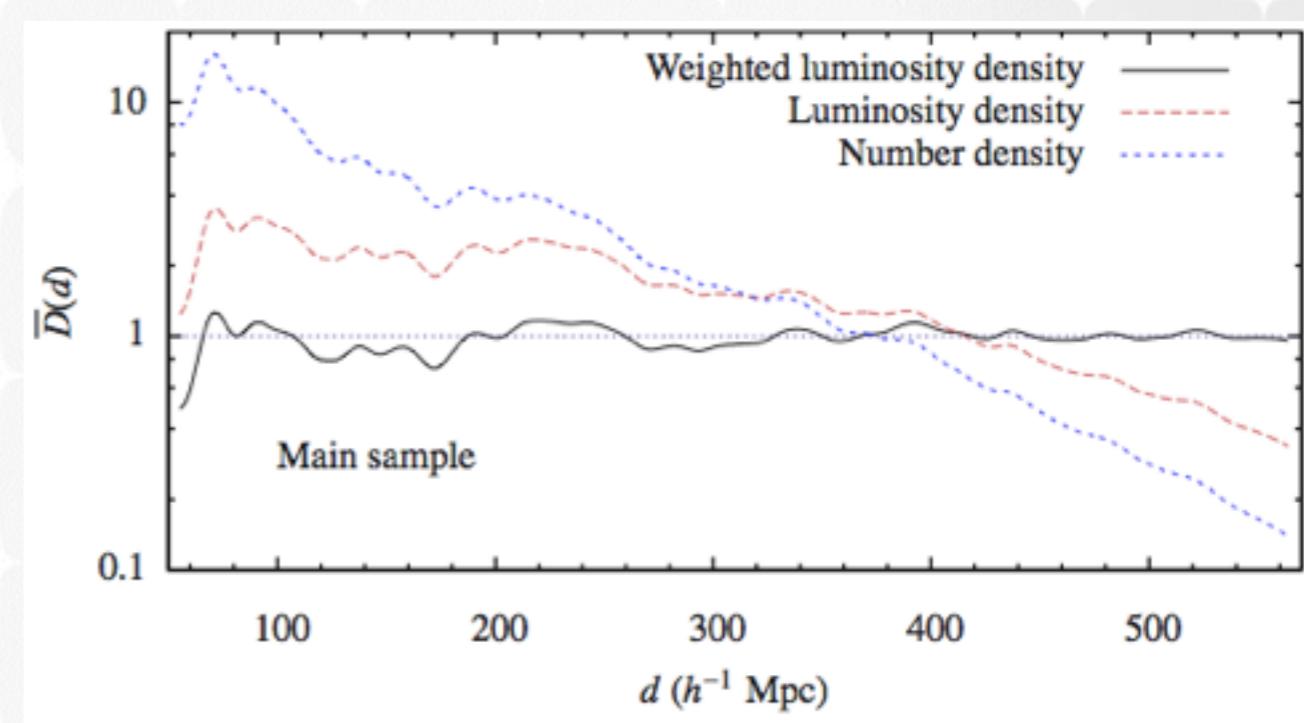
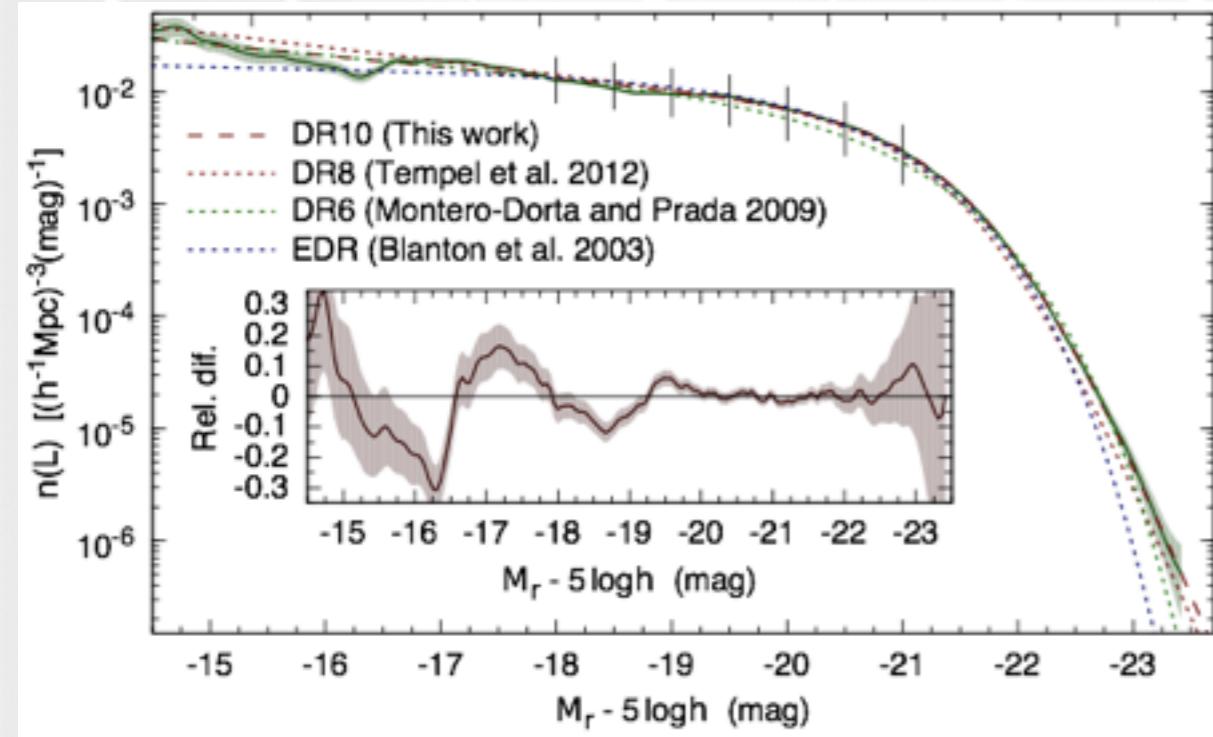
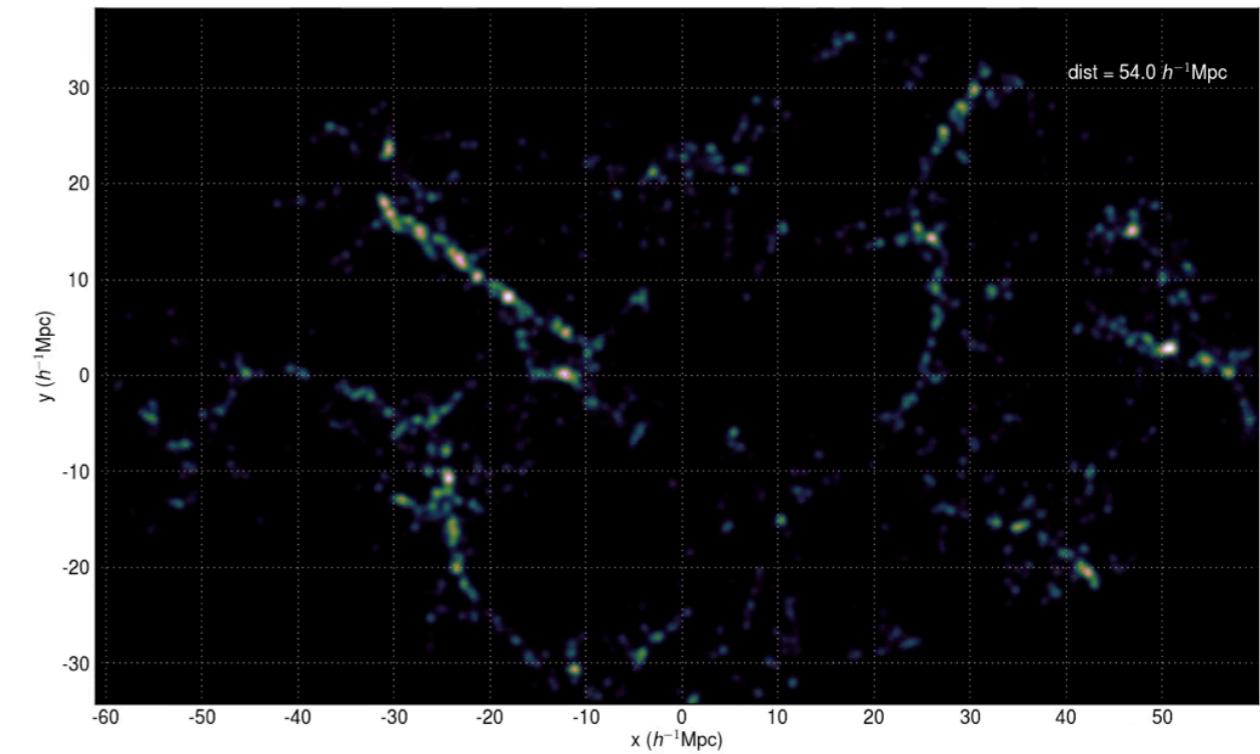
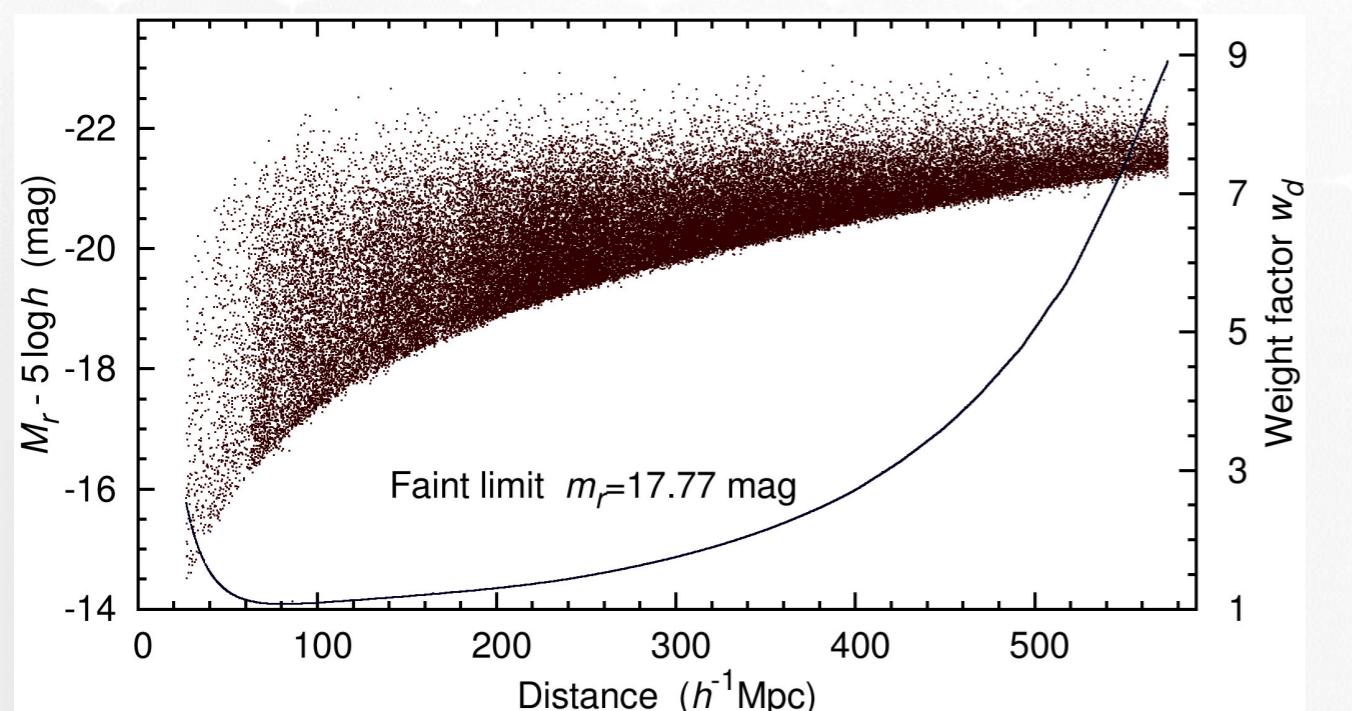
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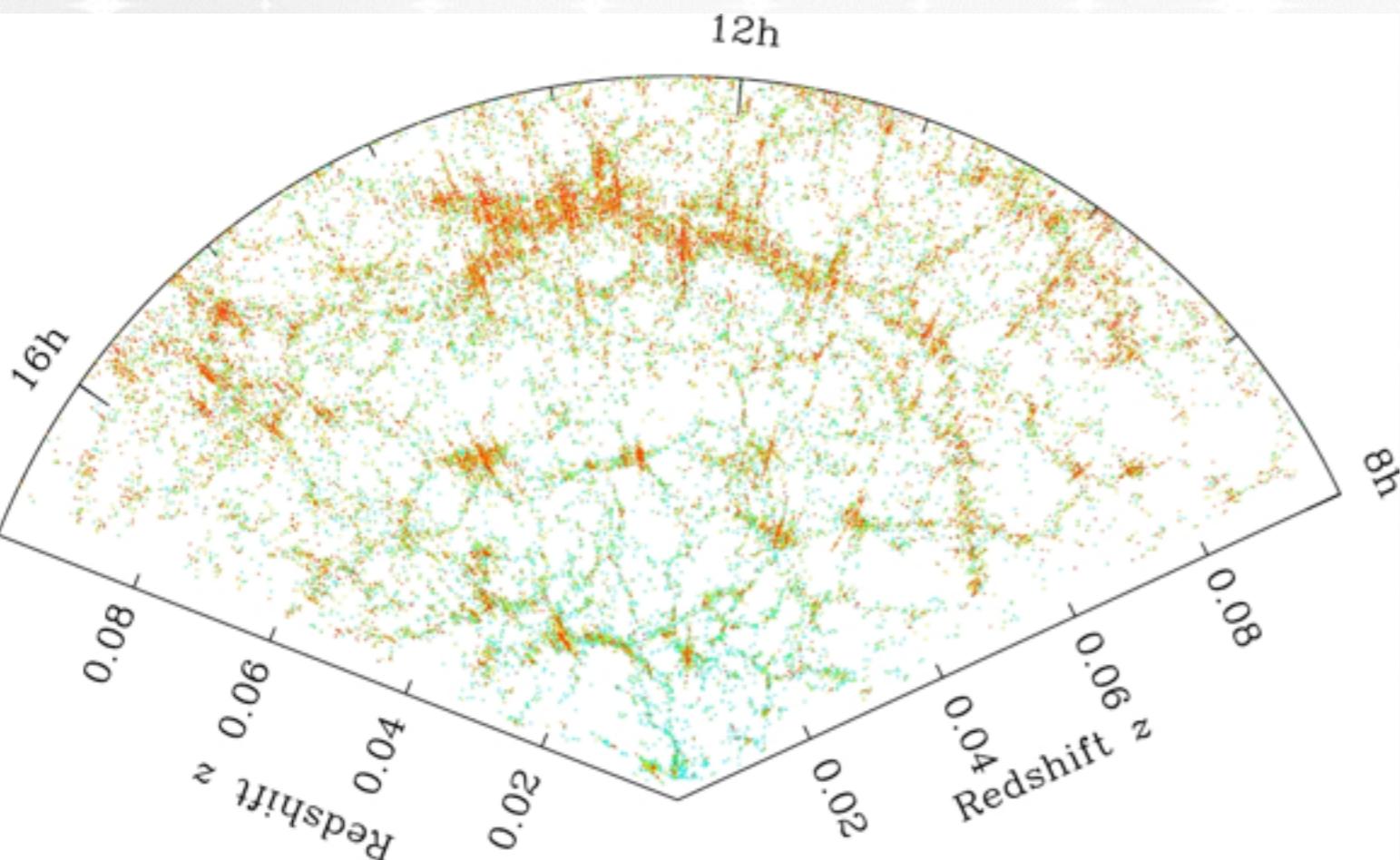
# Observations: SDSS



# Observations: selection effects (1)

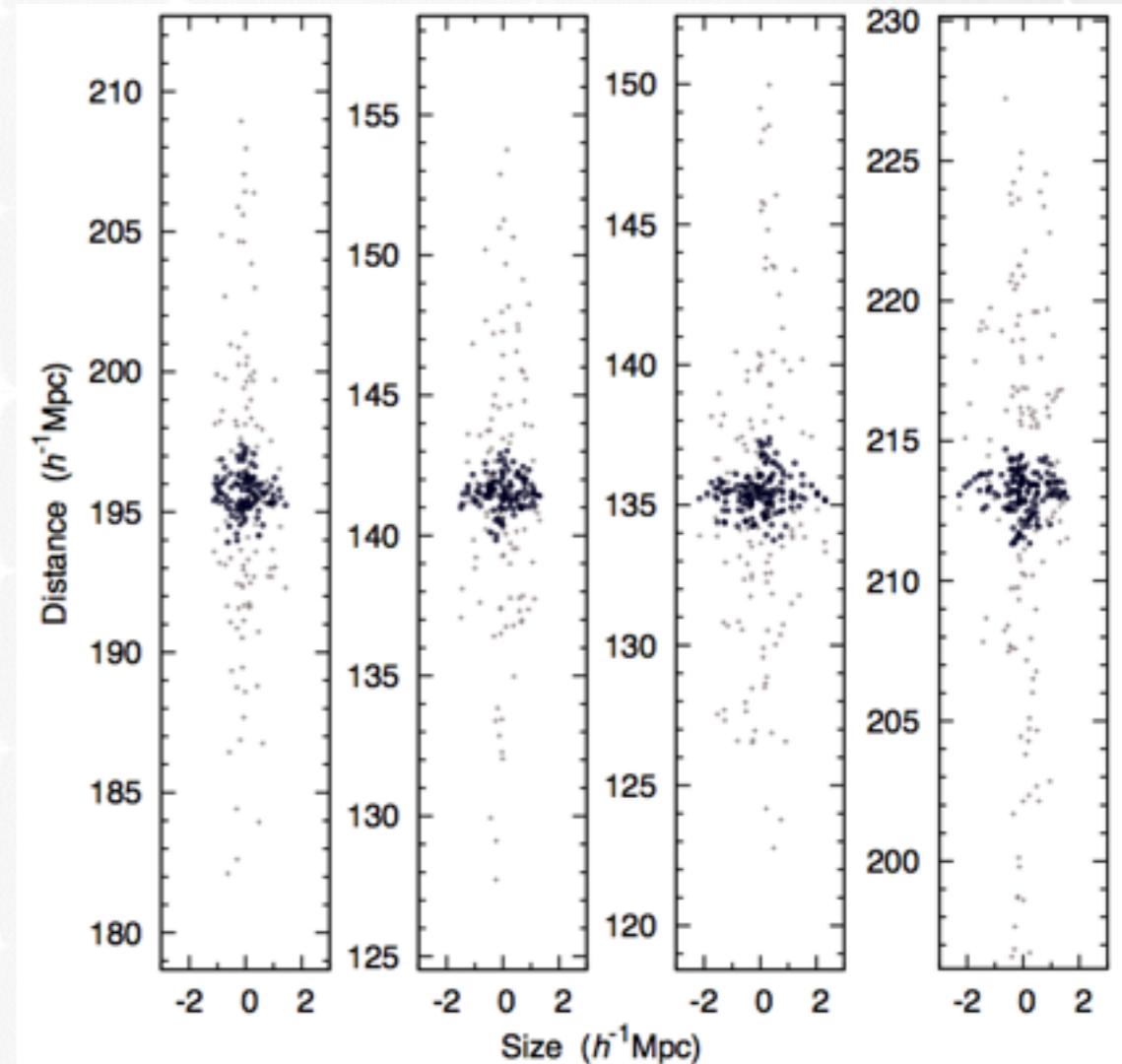


# Observations: selection effects (2)



Finger-of-god effect:

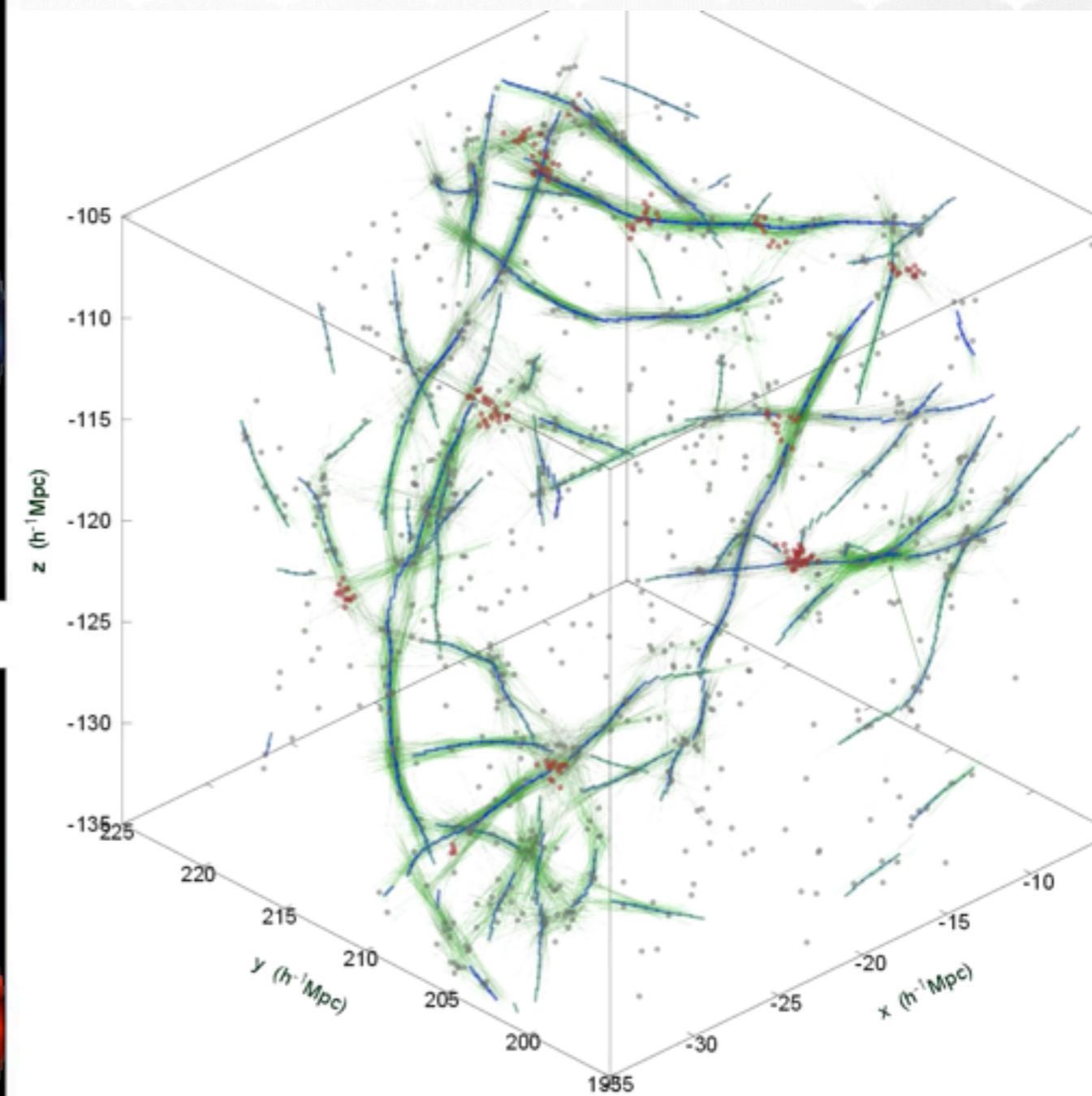
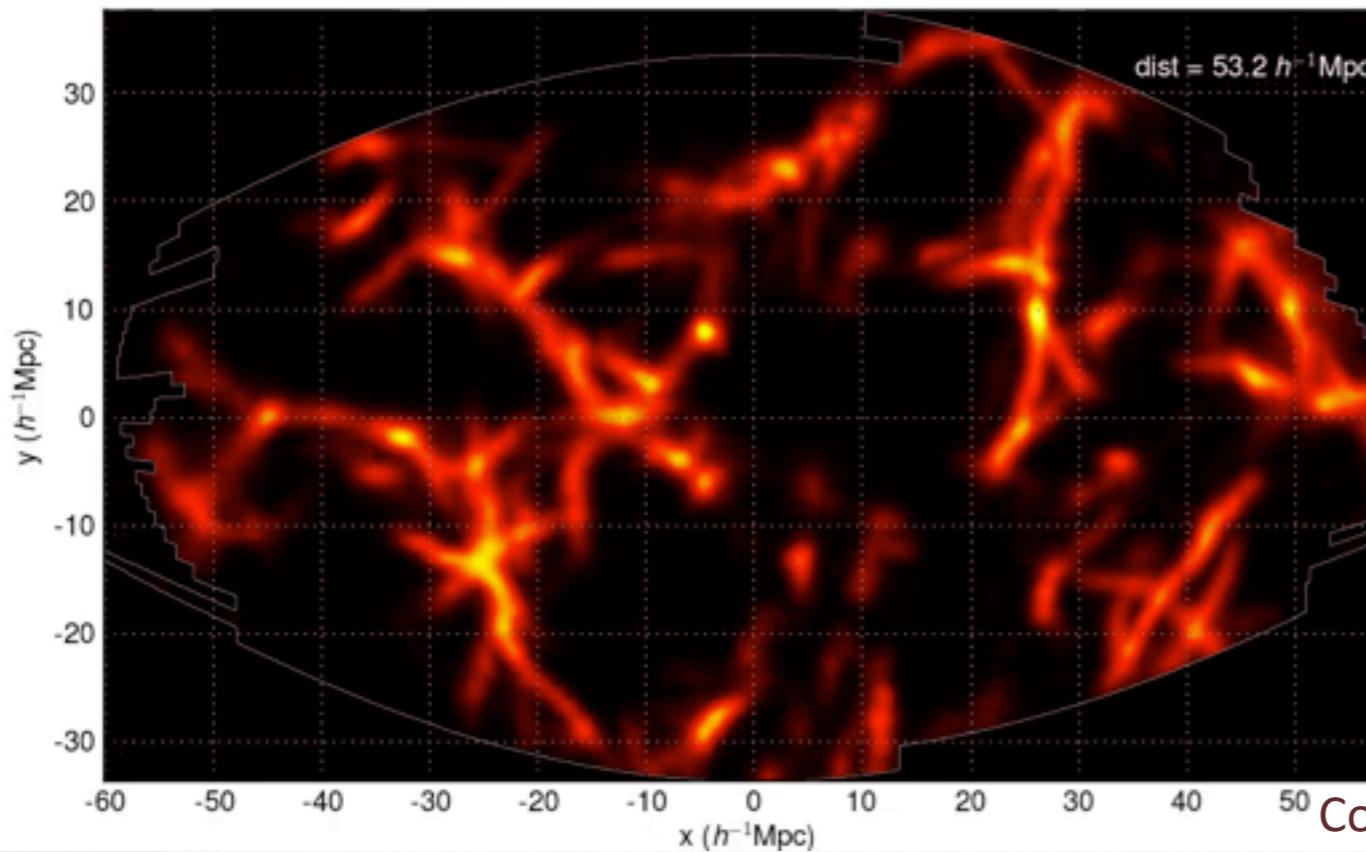
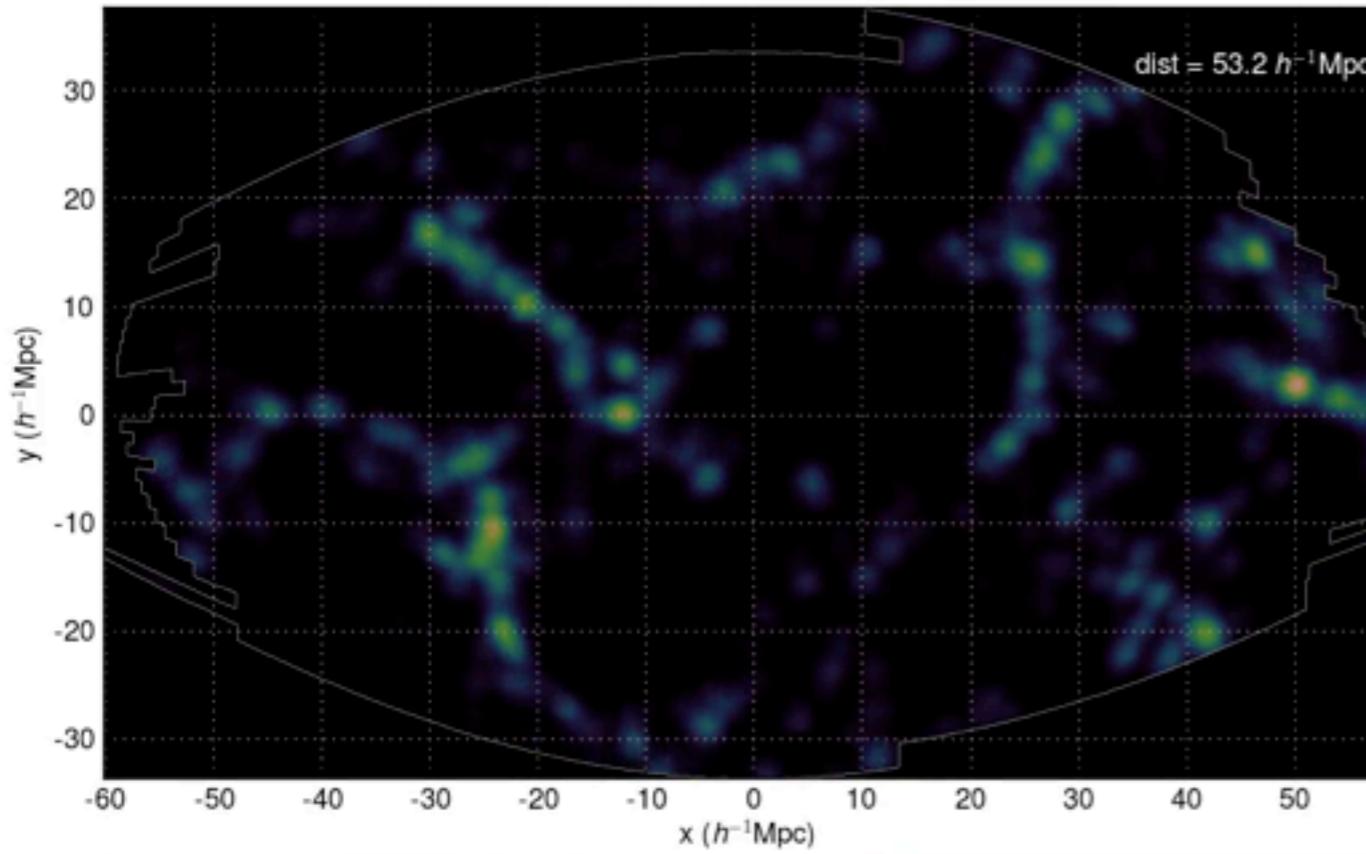
Tully & Fisher (1978), IAU Symposium 79,  
Large Scale Structures in the Universe,  
Tallinn, September 12-16, 1977



Tempel et al. (2012)

Using friends-of-friends galaxy groups,  
we suppress the finger-of-god distortions.

# Detected filamentary pattern



Tempel et al. (2014)

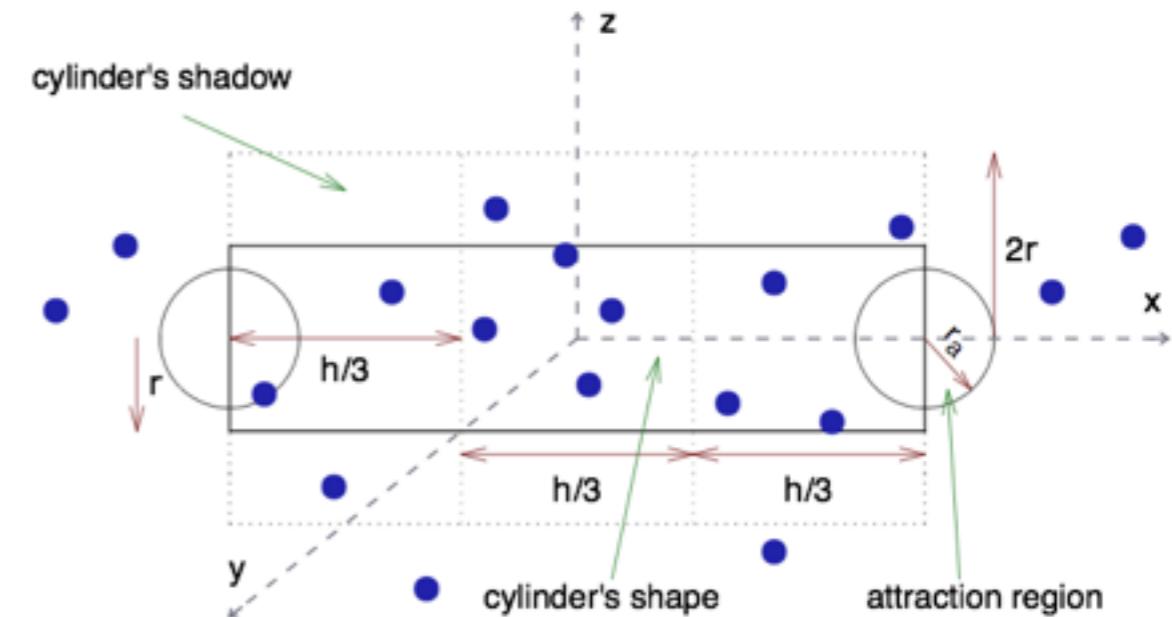
Courtesy: Juhani Liivamägi



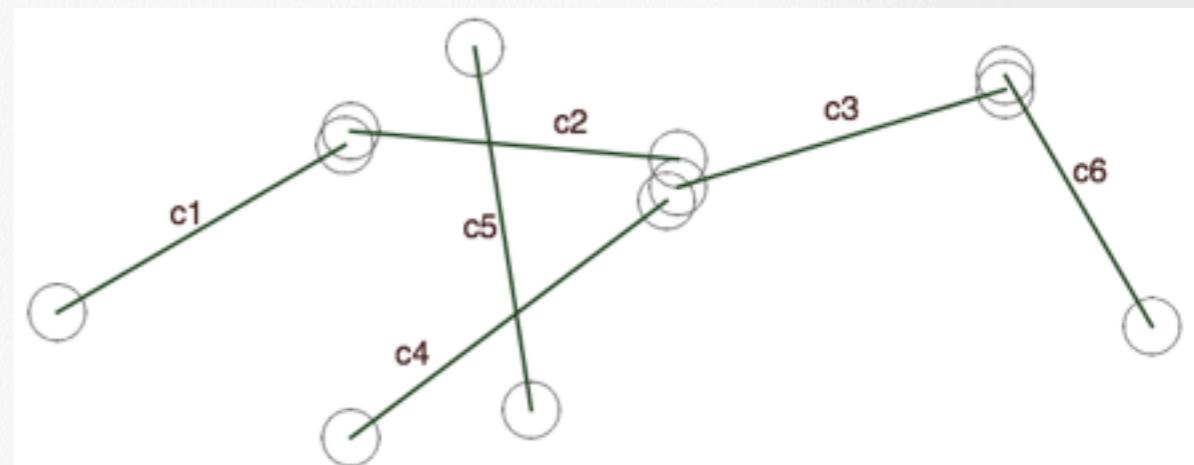
# Marked point process (Bisous model)

- ★ The key idea is to see the filamentary network as an object point process.
- ★ Cylinders are simplest objects to define a piece of filament.
- ★ Interactions help to form a network.
- ★ Metropolis-Hastings algorithm (together with simulated annealing) to sample probability distribution.

Stoica et al. (2003, 2005)  
Stoica, Martinez, Saar (2007, 2010)  
Tempel et al. (2014), arxiv:1308.2533



**Figure 1.** Two-dimensional projection of a cylinder with its shadow within a pattern of galaxies. The attraction regions are shown as spheres. The exact shape of the cylinder, it's shadow and attraction regions depend on the model.



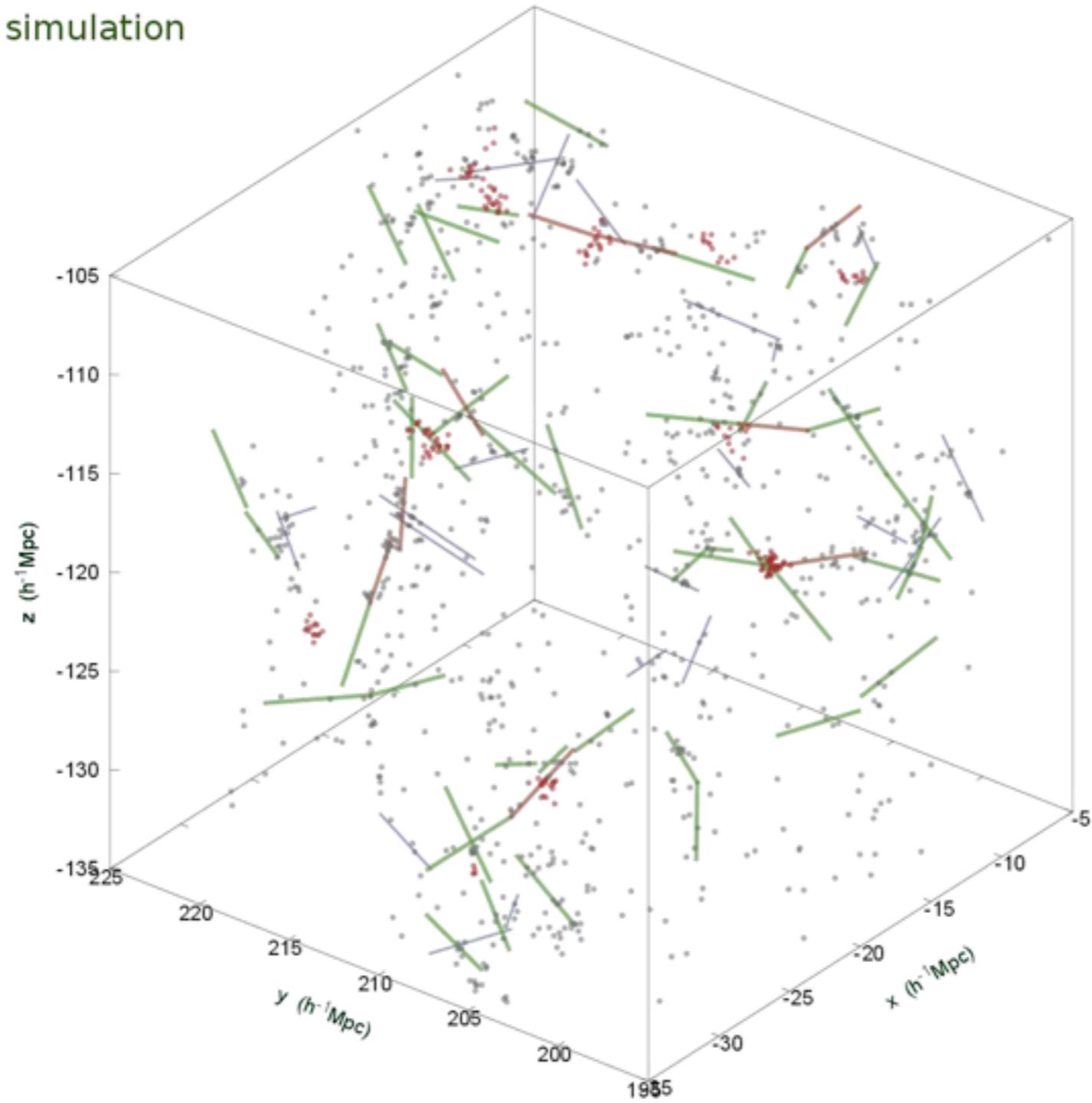
**Figure 2.** Two dimensional representation of cylinder configuration: attraction regions are shown with spheres. In this configu-



# Bisous model in action

Single MCMC simulation

- 0-connected cylinders
- 1-connected cylinders
- 2-connected cylinders
- Galaxies
- Galaxies in groups





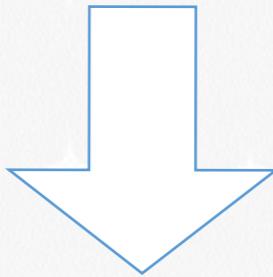
# Bisous model: key questions

- ★ What is the local definition for a filament?
- ★ How connected is the filamentary network?
- ★ What is the scale of galactic filaments?
- ★ How to describe the multi-scale nature of filaments?

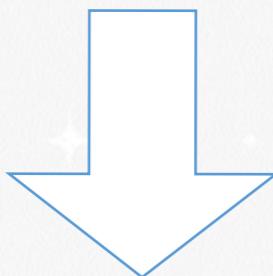


# Extracting filament spines

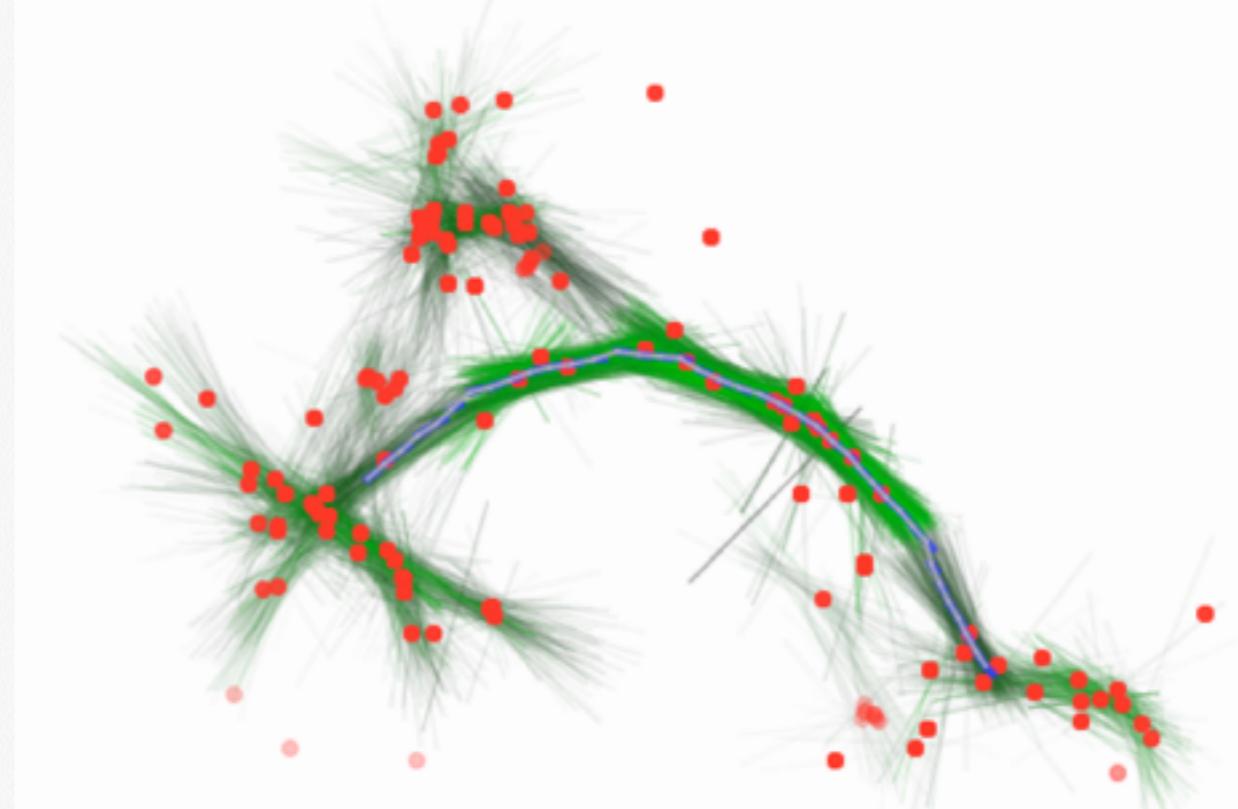
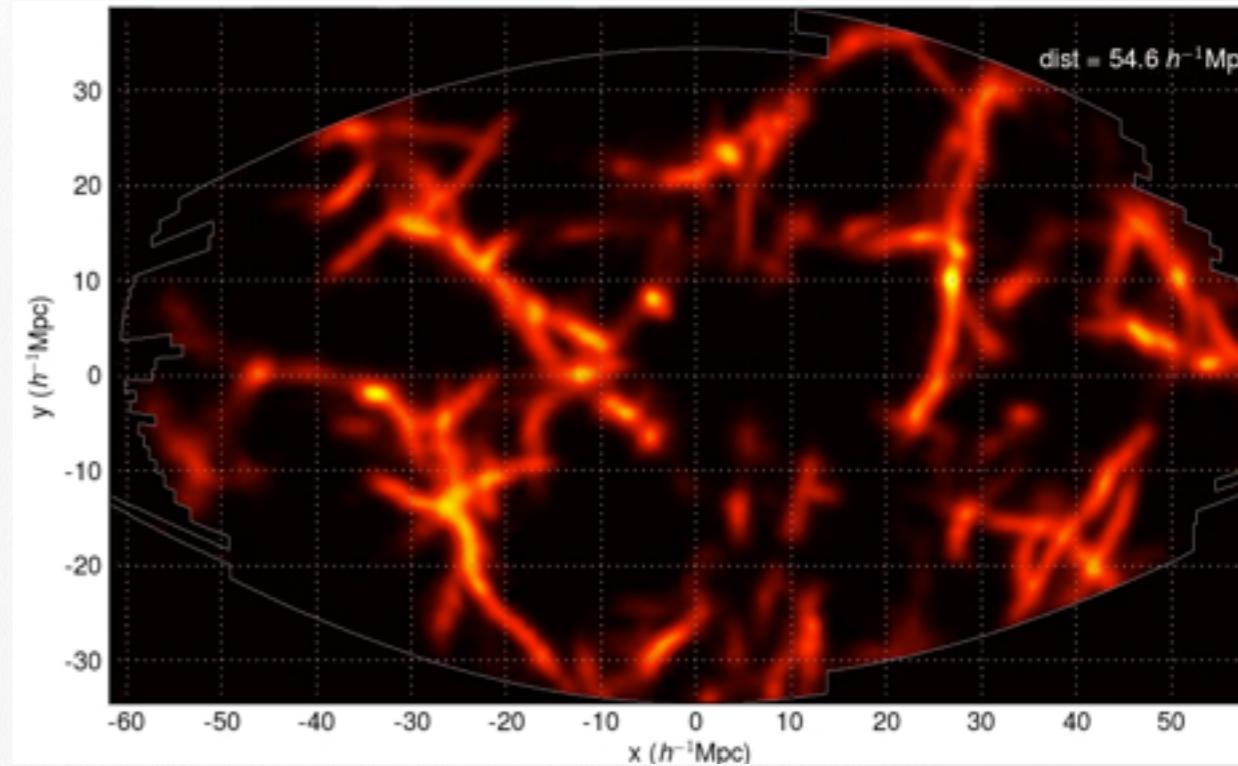
- ★ Bisous model: set of simulations (50 simulations)
- ★ Many independent realisations in every simulation



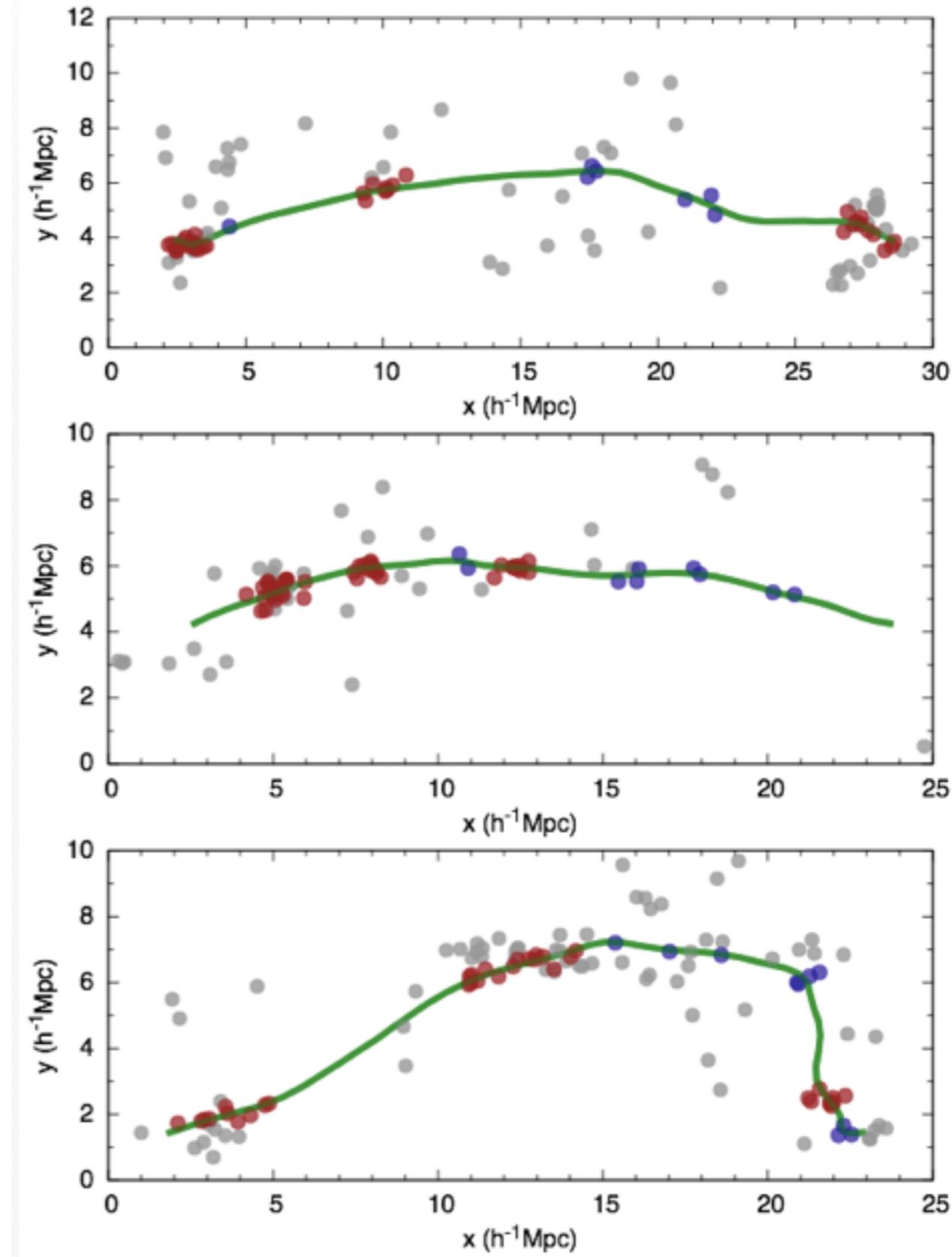
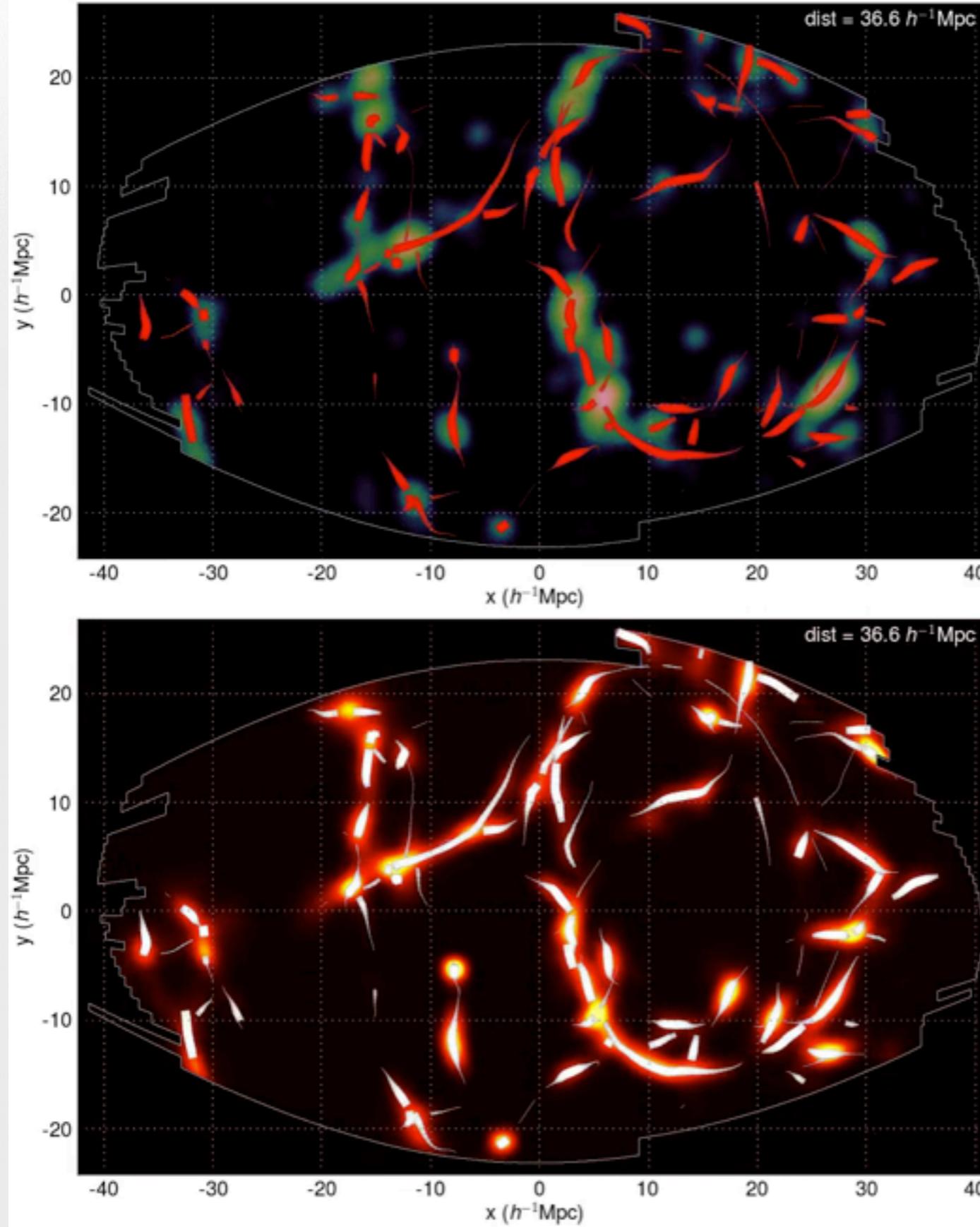
- ★ Density field of filaments
- ★ Orientation field of filaments



- ★ Single filament spines

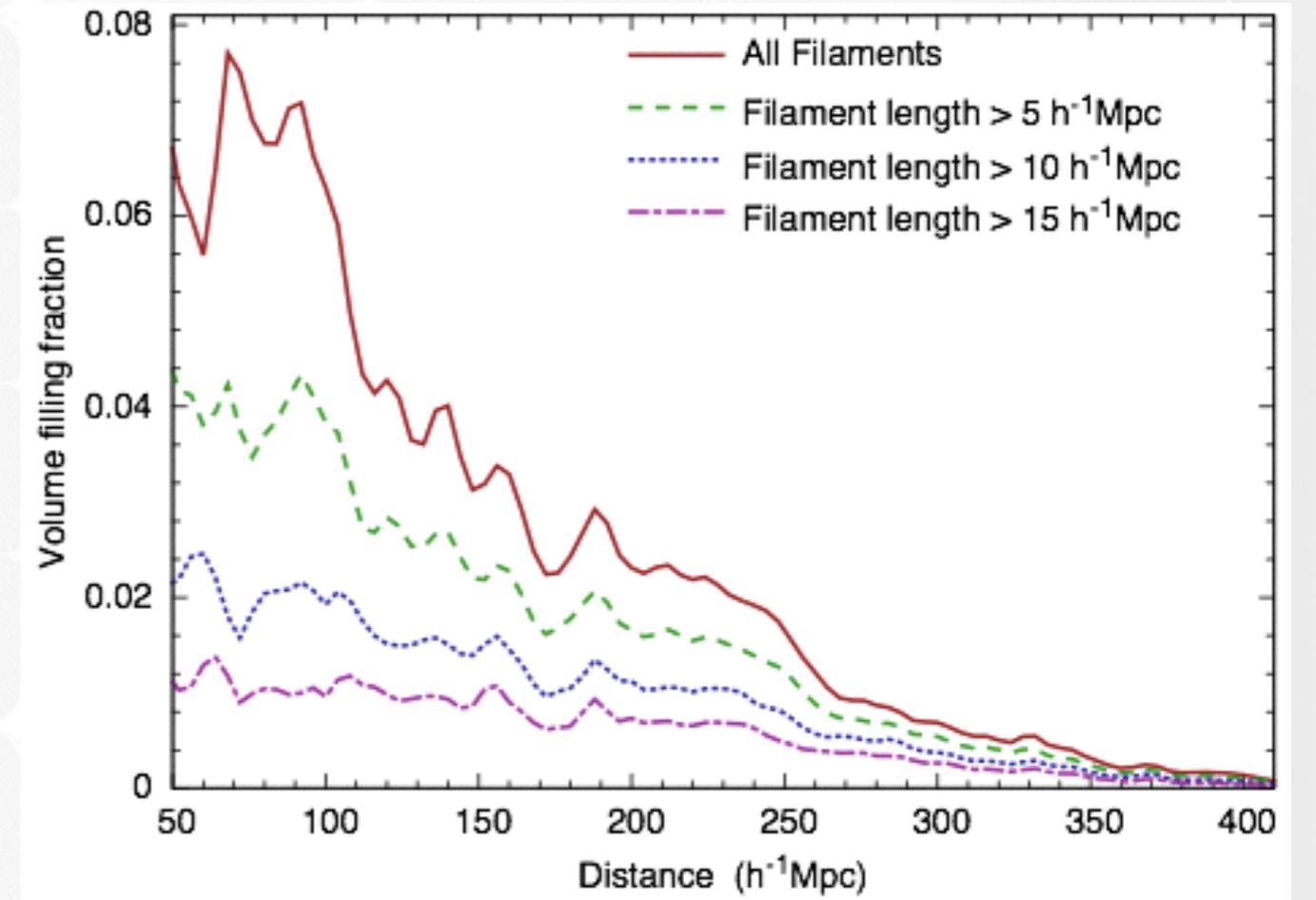
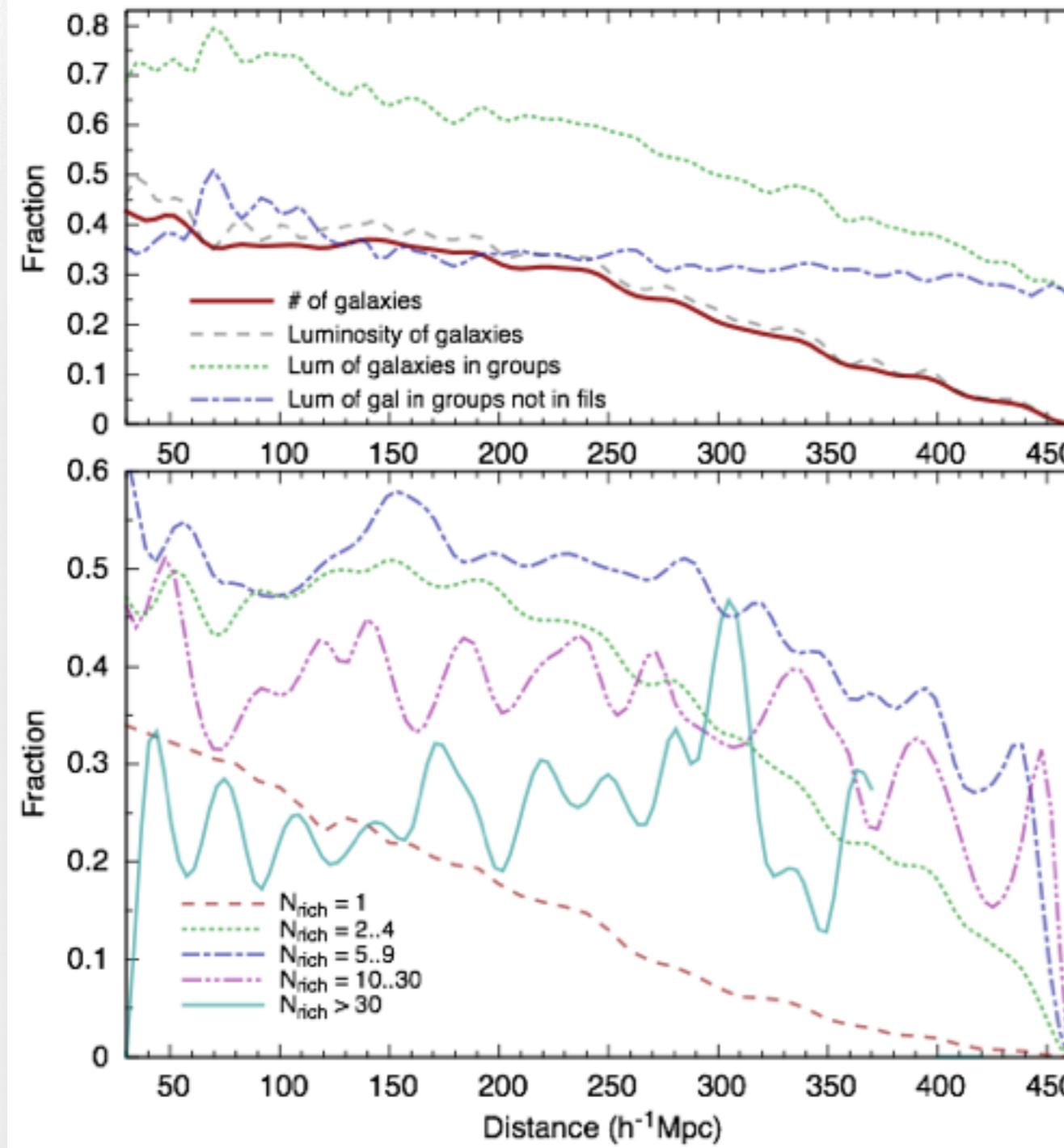


# Detected filament spines





# A catalogue of filaments for the SDSS

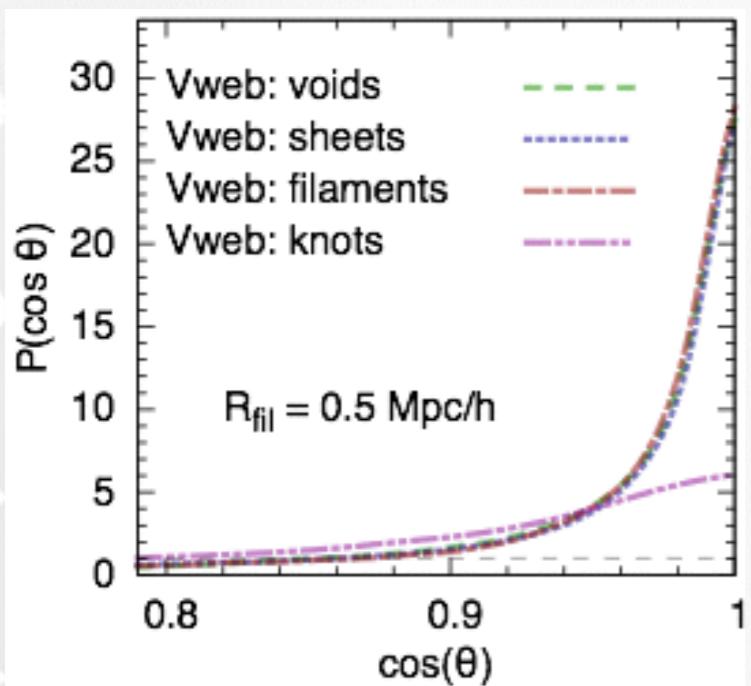


Tempel et al. (2014), arxiv:1308.2533  
<http://cosmodb.to.ee>

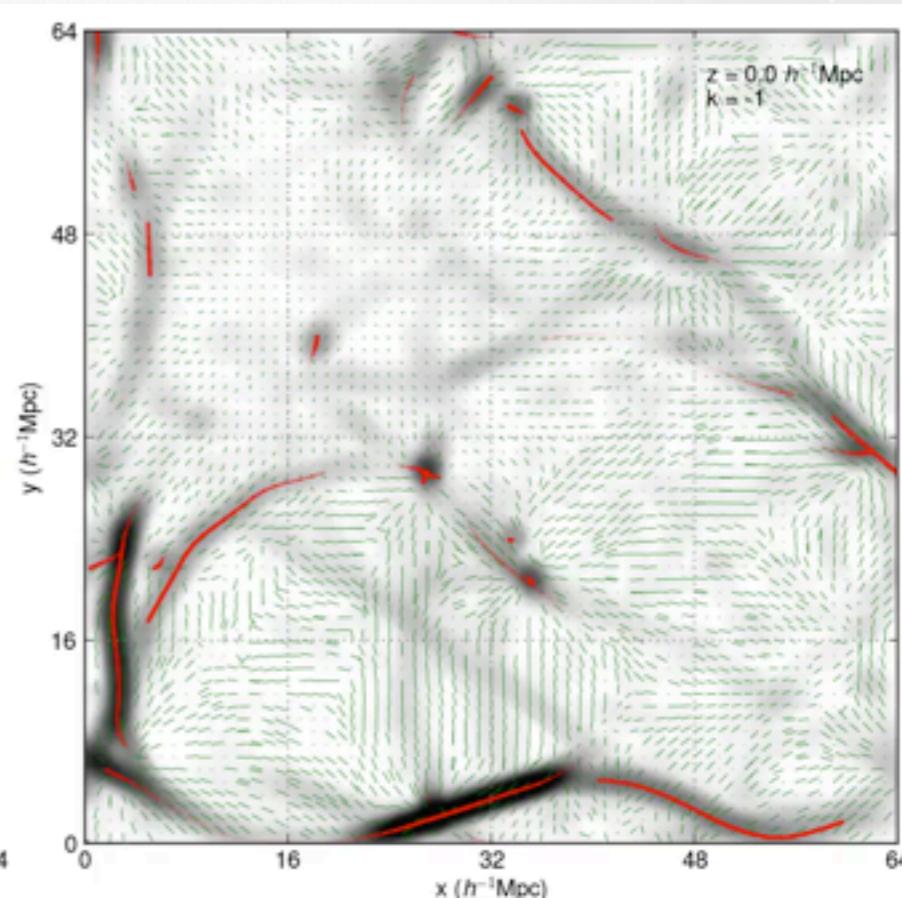
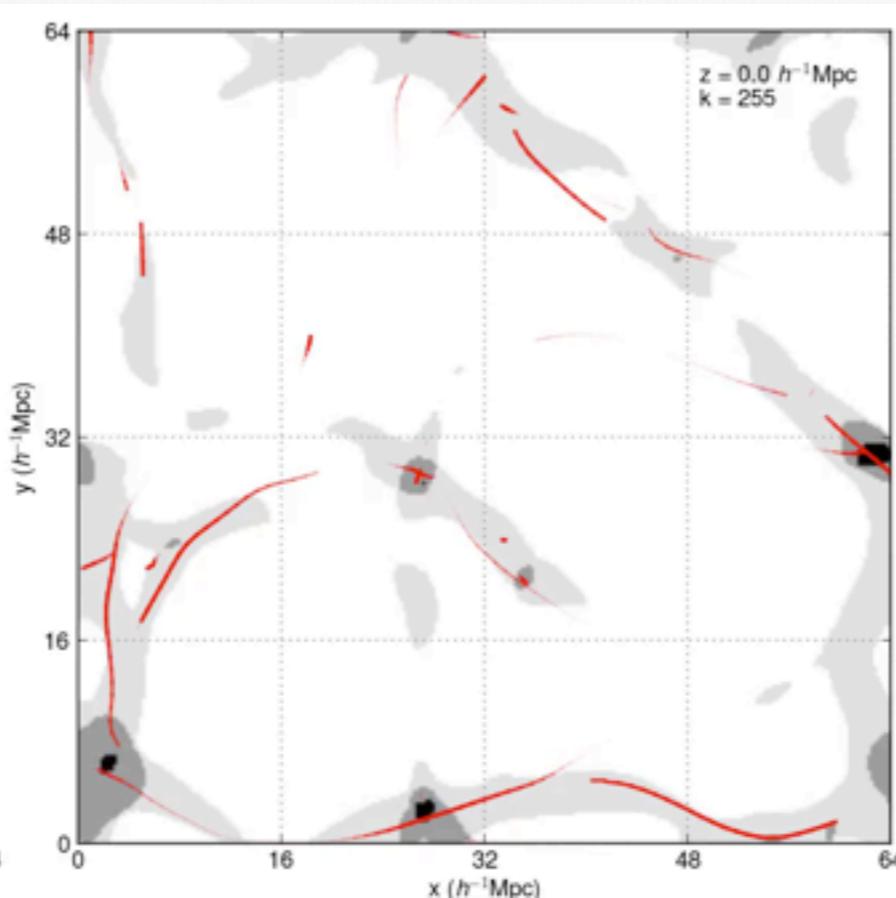
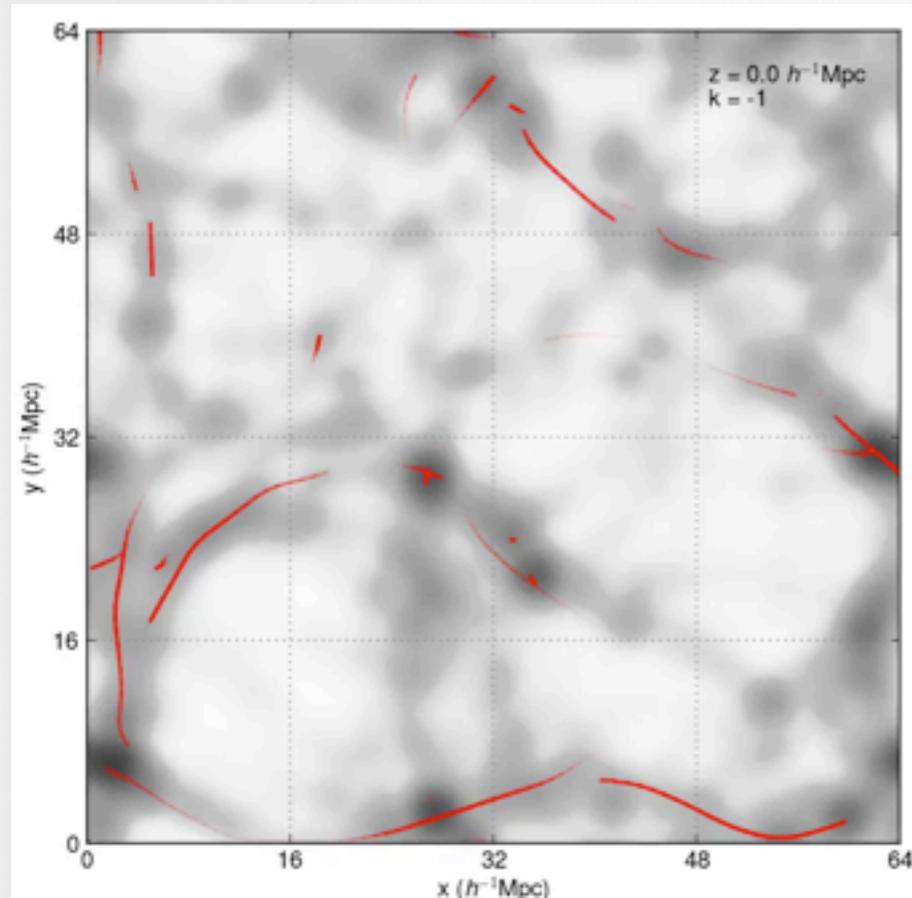
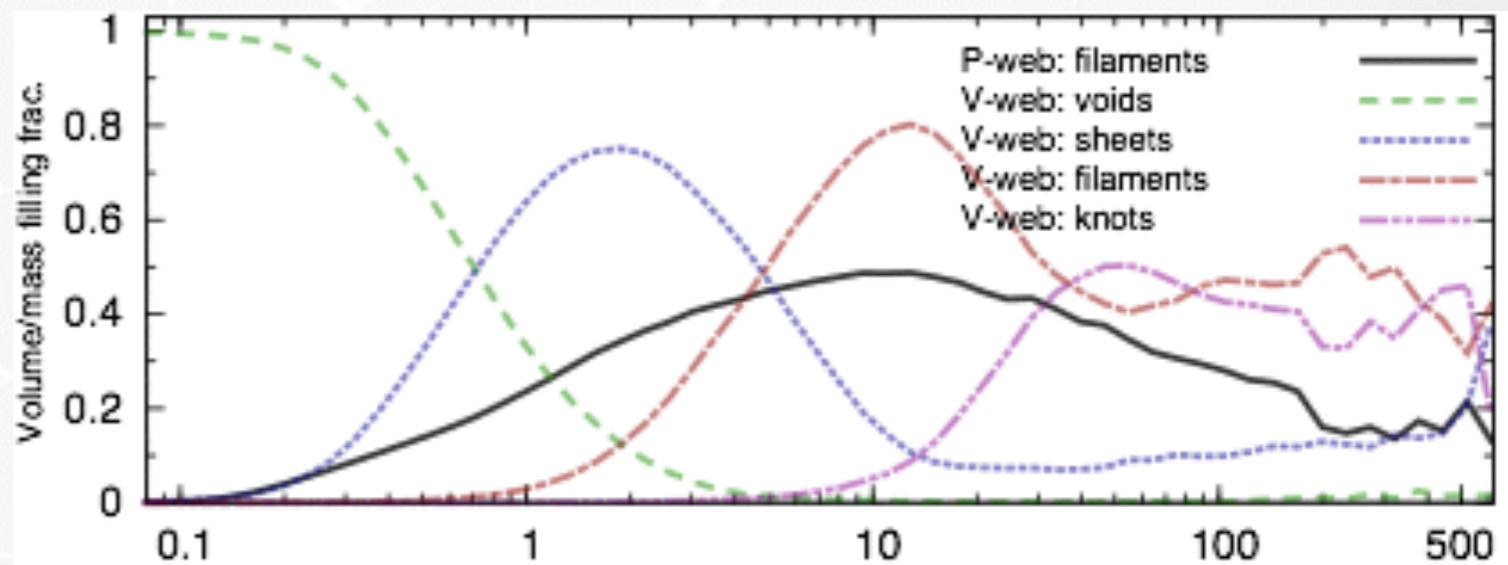


# Applications of filamentary network

# Orientation of cosmic web filaments with respect to the underlying velocity field



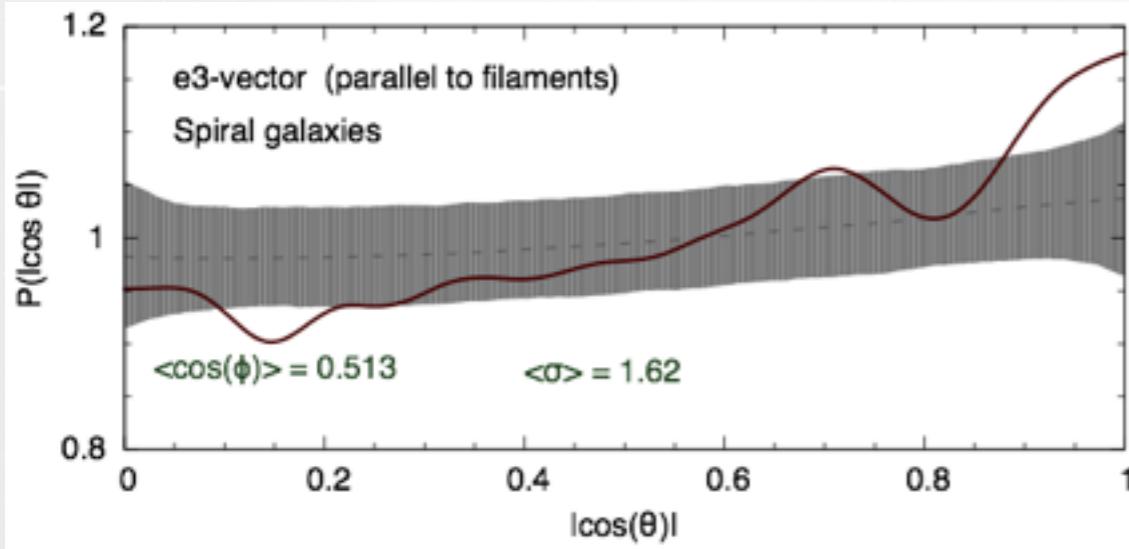
Tempel, Libeskind, Hoffmann et al. (2014)



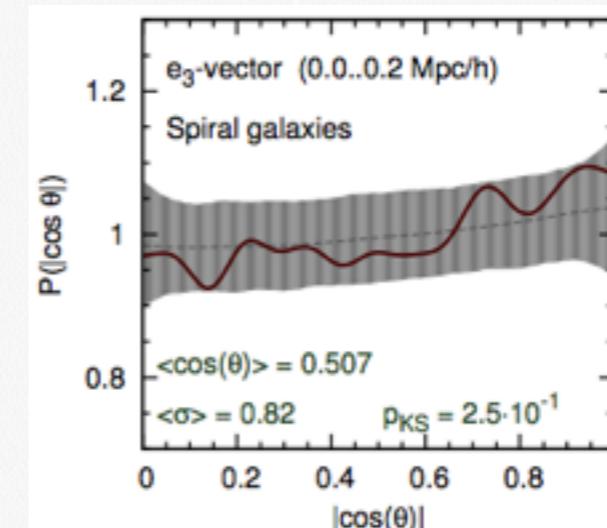
# Galaxy Spin Alignment in Filaments: Observational Evidence

Tempel & Libeskind (2013); Tempel, Stoica & Saar (2013)

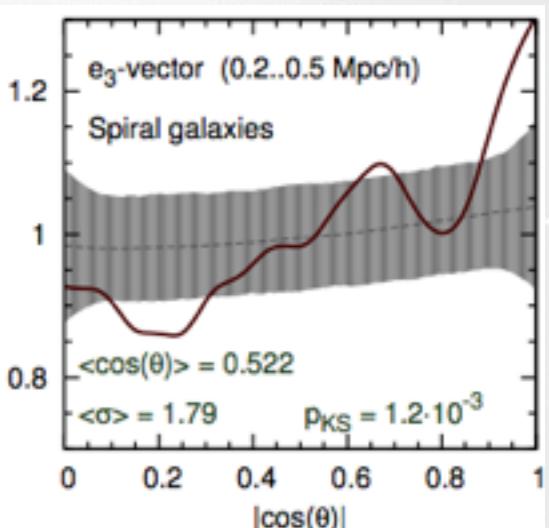
## Spiral galaxies



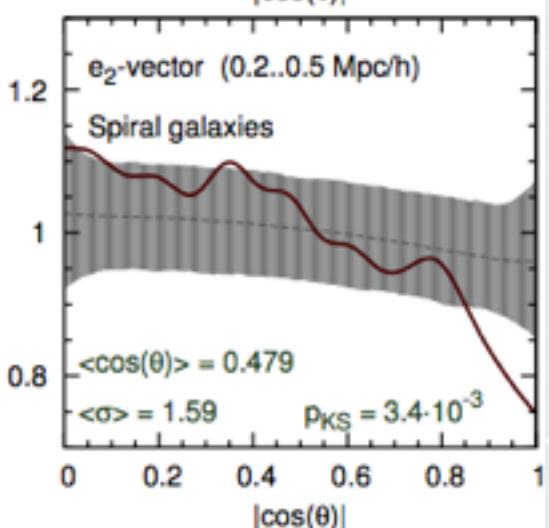
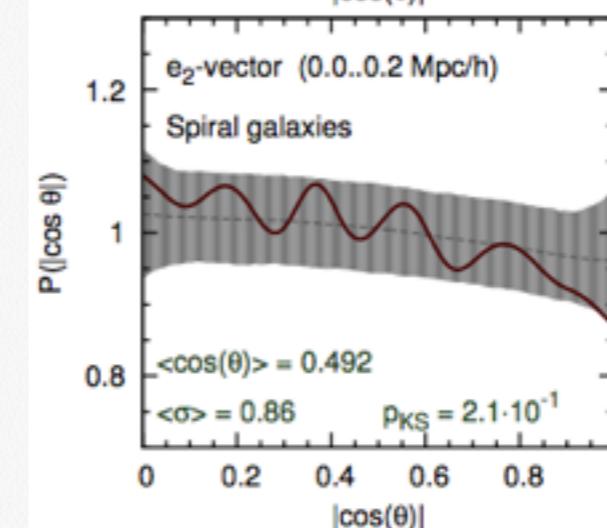
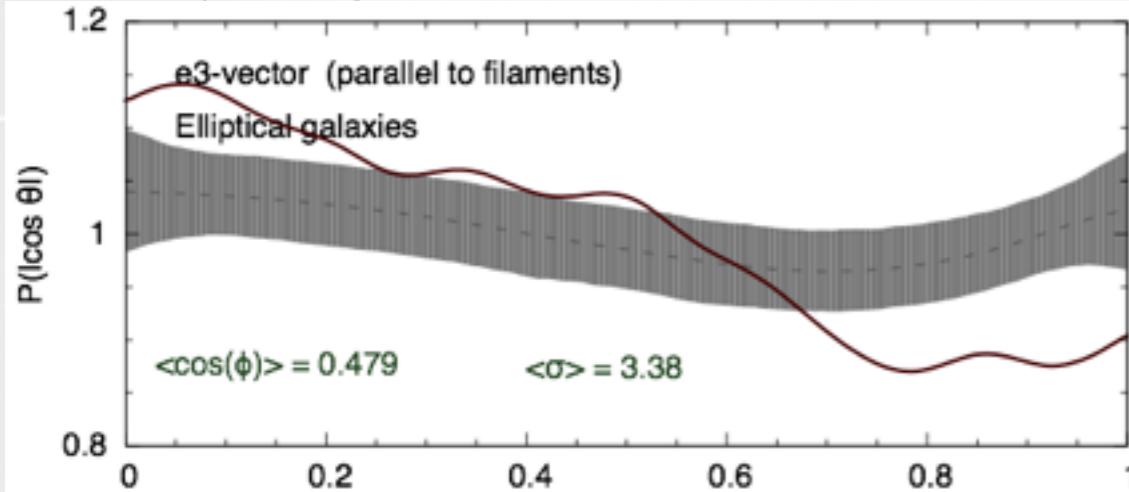
## Inner part



## Outer part



## Elliptical galaxies



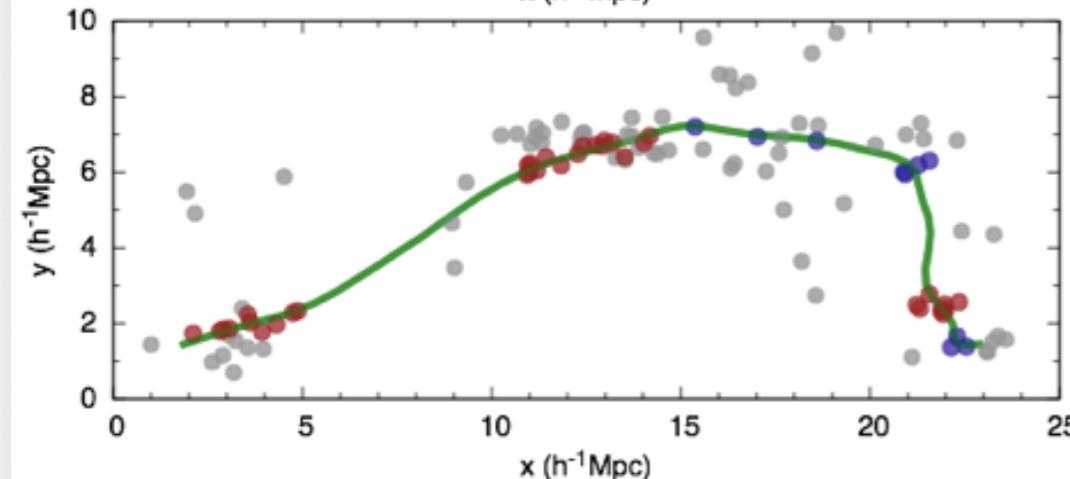
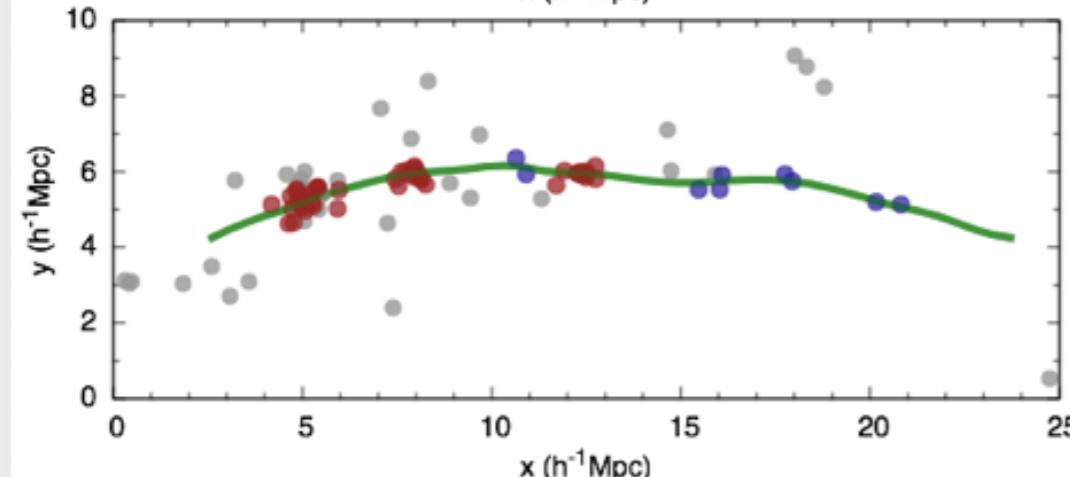
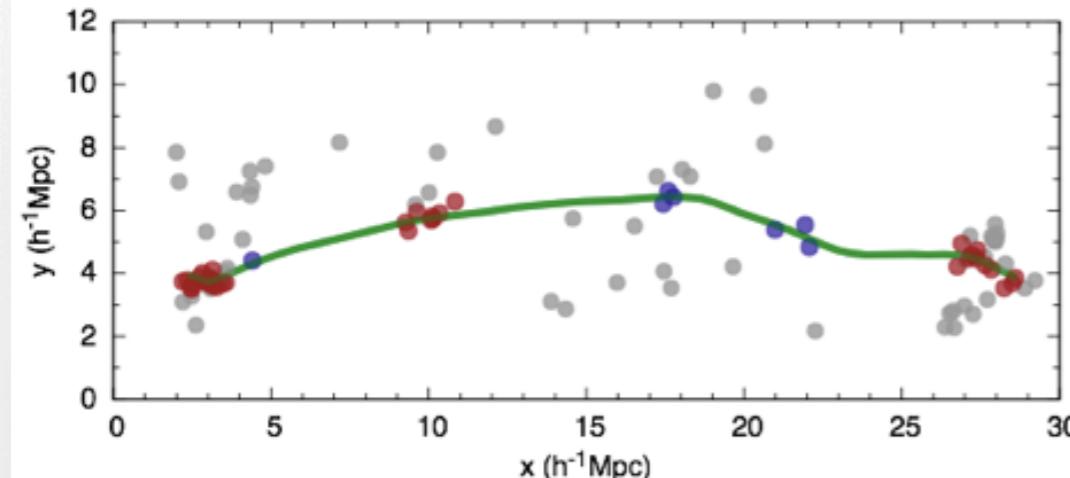


Galaxy filaments  
as  
pearl necklaces

Tempel et al. (2014), arXiv:1406.4357



# Data and methods



Pair correlation function:

$$\widehat{\xi}(r) = 1 + \frac{DD(r)}{RR(r)} - 2\frac{DR(r)}{RR(r)},$$

Rayleigh Z-squared statistics:

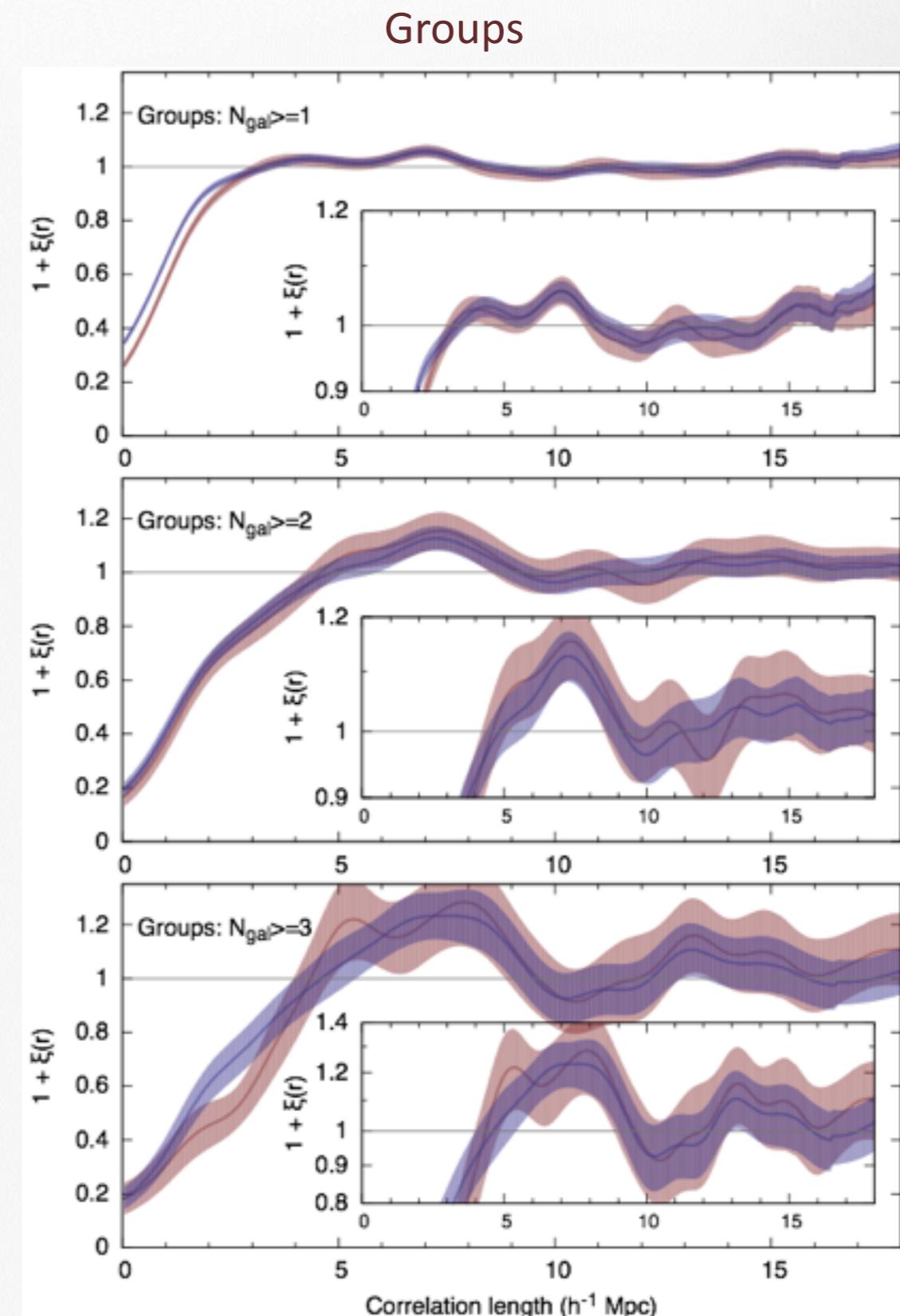
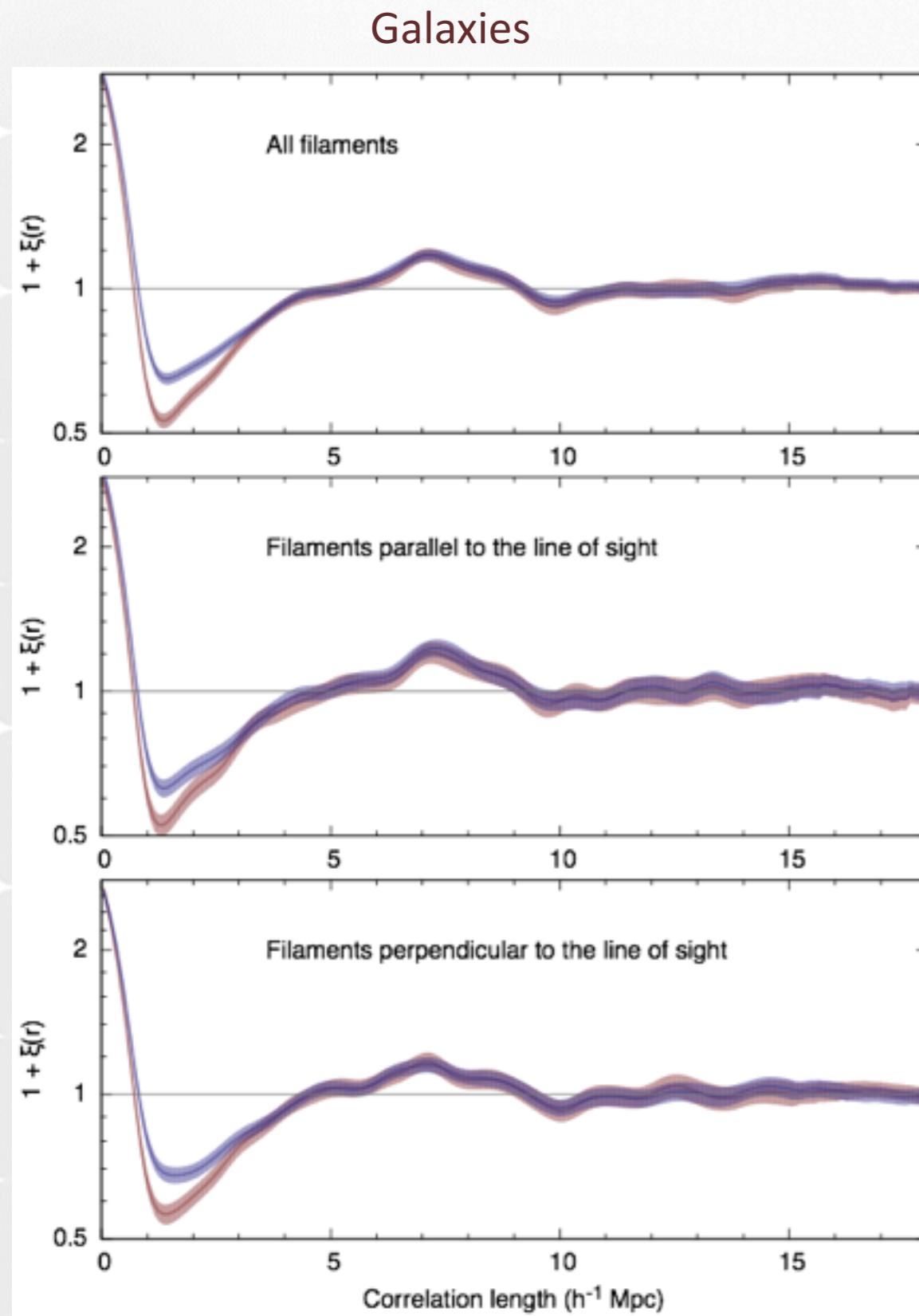
The algorithm works as following. For each filament, we produce a periodogram using the  $Z_1^2$  (Rayleigh statistics),

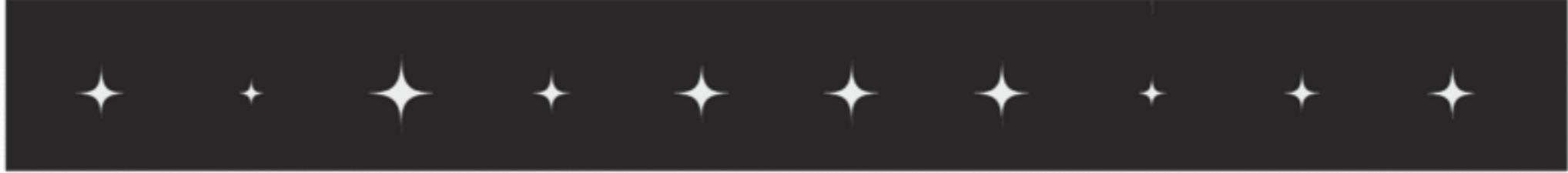
$$Z_1^2 = \frac{2}{N} \left[ \left( \sum_{j=1}^N \cos \phi_j \right)^2 + \left( \sum_{j=1}^N \sin \phi_j \right)^2 \right], \quad (4)$$

where  $N$  is the number of galaxies in a filament and  $\phi_j = 2\pi l_j/d$  is the phase value for a galaxy  $j$  for a fixed period  $d$ ;  $l_j$  is a galaxy  $j$  distance along the filament spine from the beginning of the filament.



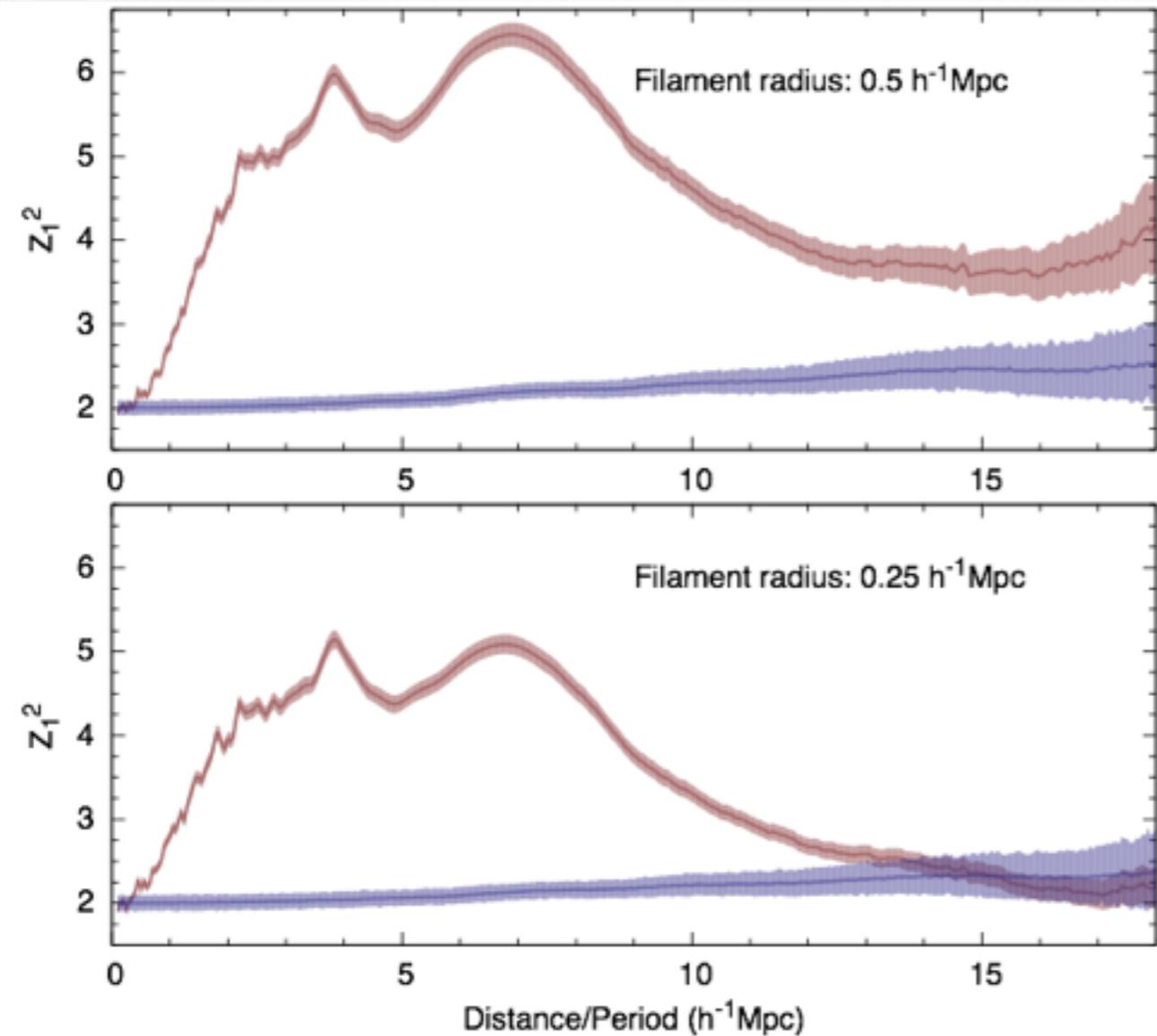
# Pair correlation function along filaments



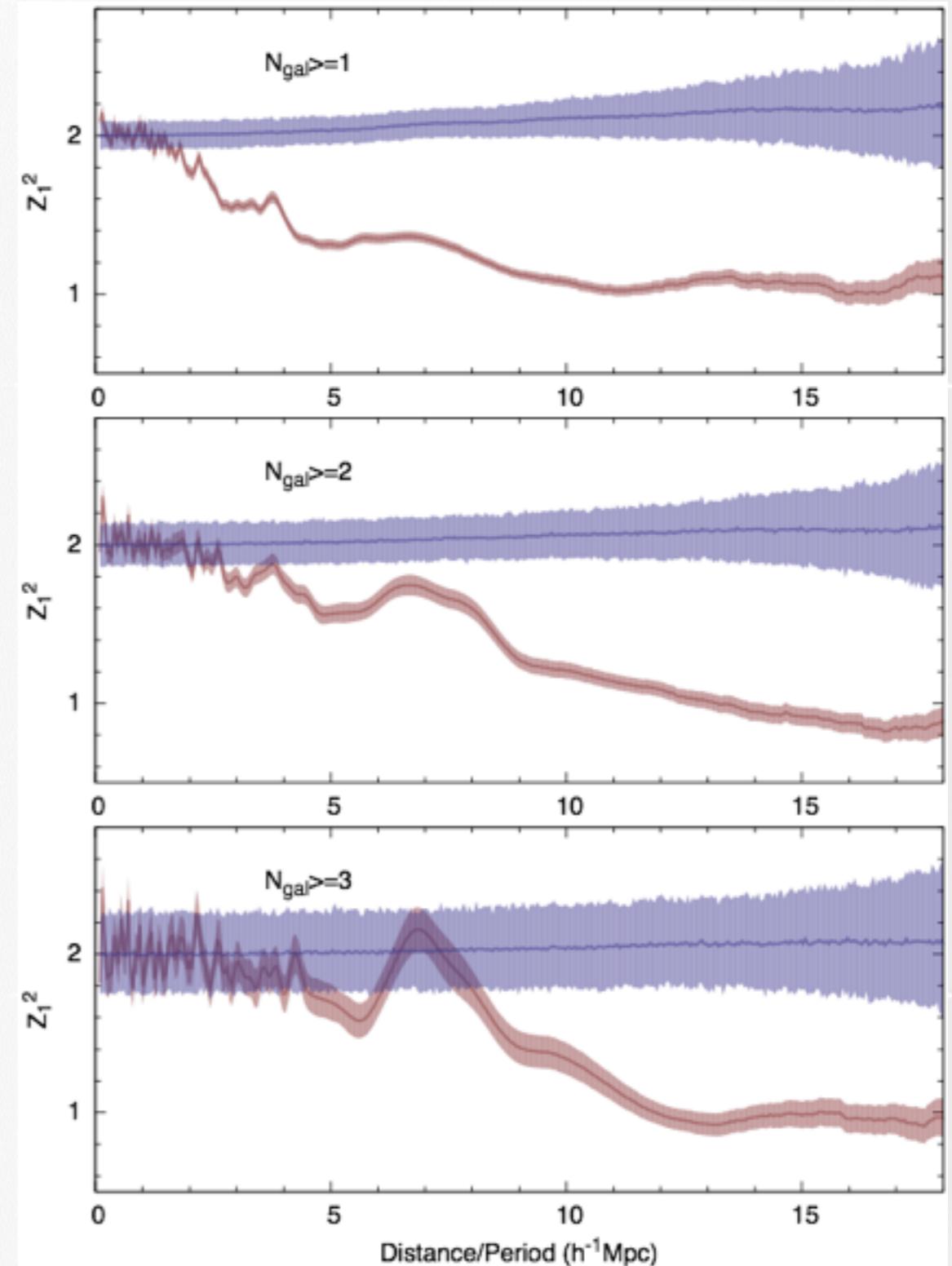


# Regularity of galaxies along filaments

Galaxies



Groups



**Fig. 7.** The Rayleigh (Z-squared) statistic  $Z_1^2$  for a given distance (period). The upper panel shows the results for galaxies closer than  $0.5 h^{-1}\text{Mpc}$  to the filament axis and the lower panel shows the results for galaxies closer than  $0.25 h^{-1}\text{Mpc}$ . The red line shows the  $Z_1^2$  statistics together with the jackknife 95% confidence estimate. The blue line shows the results from Monte Carlo simulations for the null hypothesis together with the 95% confidence limits.



## Summary

- ★ We developed a probabilistic model for filamentary network detection, based on marked point processes (the Bisous model).
- ★ We applied the Bisous model to the SDSS dataset and generated a catalogue of filaments (<http://cosmodb.to.ee>).
- ★ We studied the distribution of galaxies/groups along filaments and showed that they tend to form a regular pattern. The characteristic length of the pattern is about 7 Mpc/h.
- ★ We propose that this well-defined characteristic scale could be used as a cosmological test.

