



# Tessellations in Cosmology

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Leiden Tessellations Workshop,  
19 Nov 2009



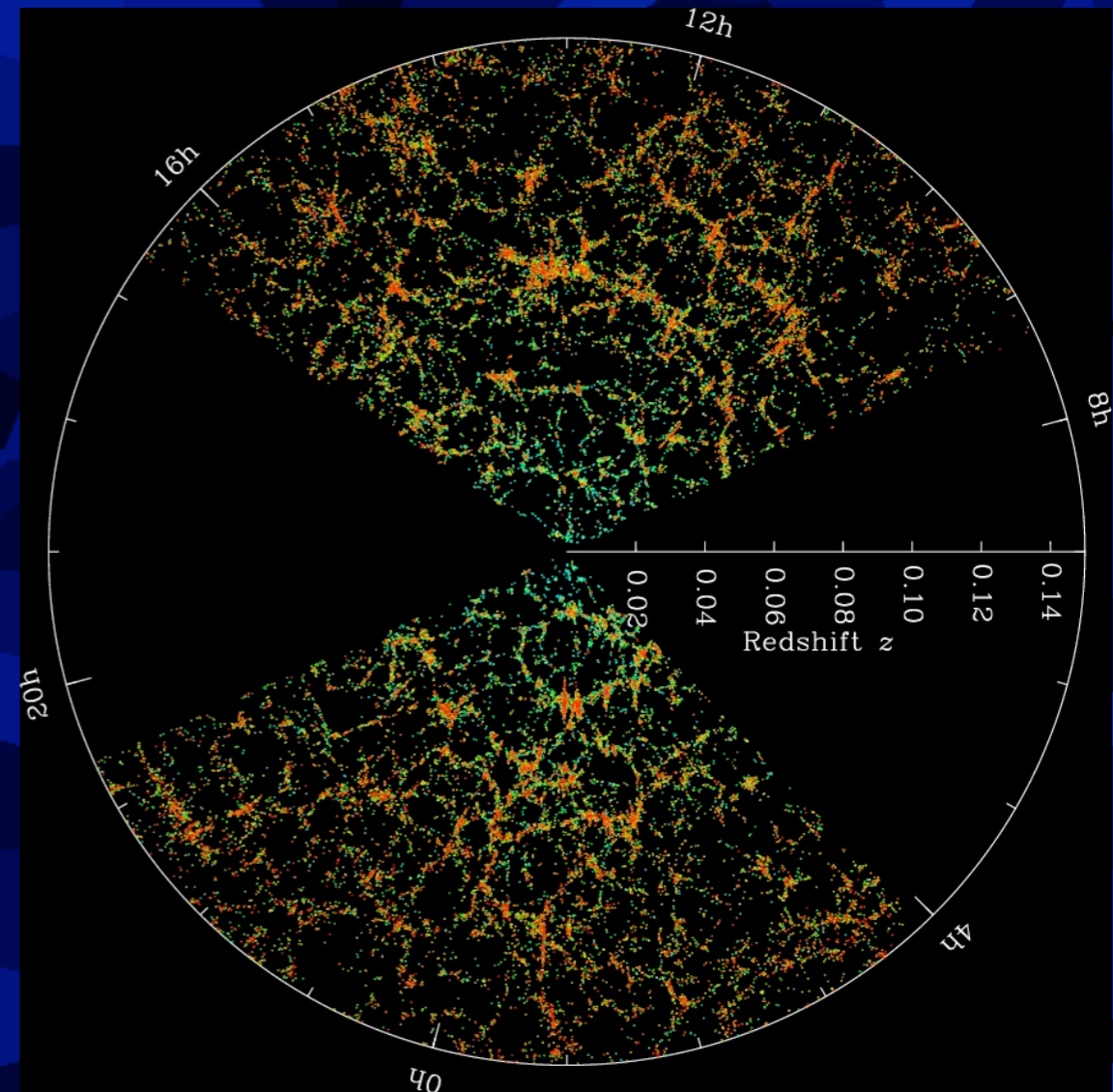
# Outline

- I. The large-scale structure of the Universe as a Voronoi foam
- II. Tessellation methods of data analysis (that I've used)
  - A. Density estimation
  - B. Void, cluster finding -- superstructures and dark energy
  - C. Estimation of the cosmological potential
  - D. Measuring divergences of a vector field

# Large-scale structure

How large is large? Length scales of galaxy clustering, i.e. scales of intergalaxy separations.

Voids, filaments visible on moderately large scales. Why?



Sloan Digital Sky Survey

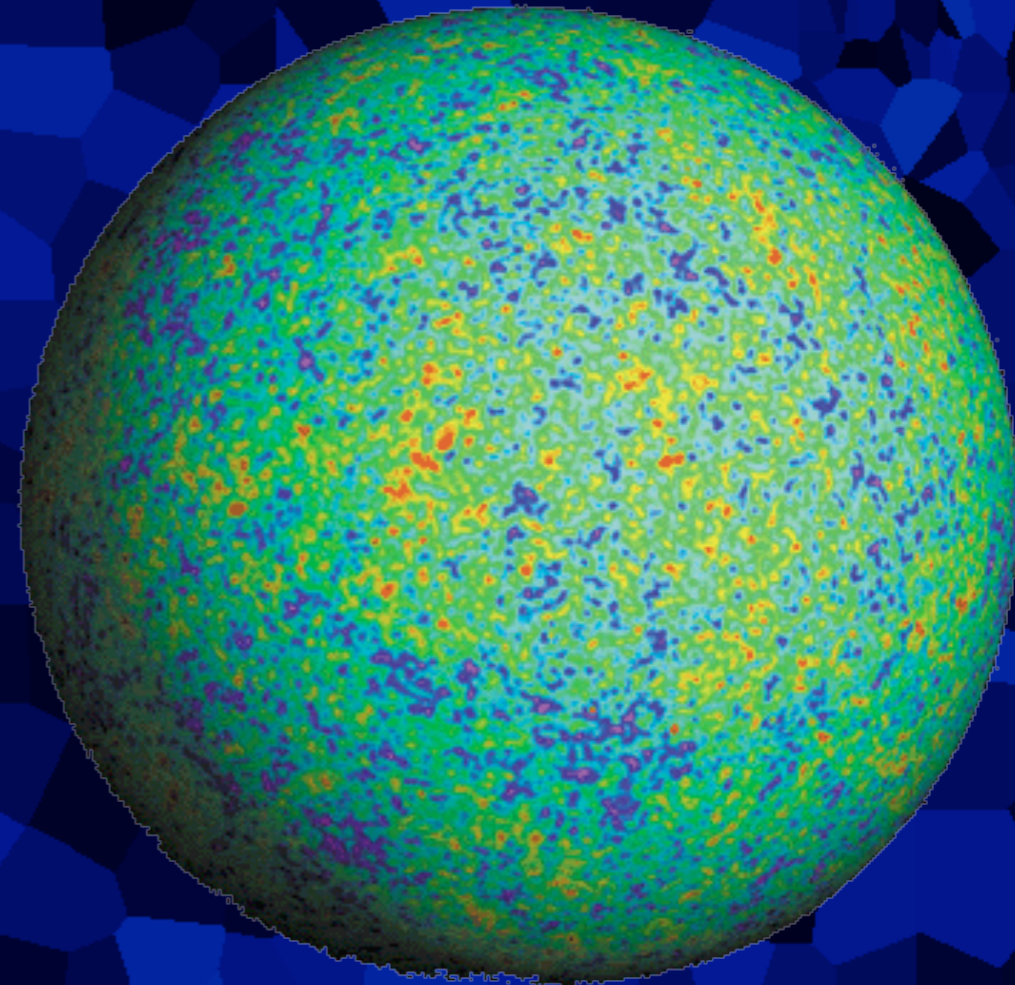


# Large-scale structure

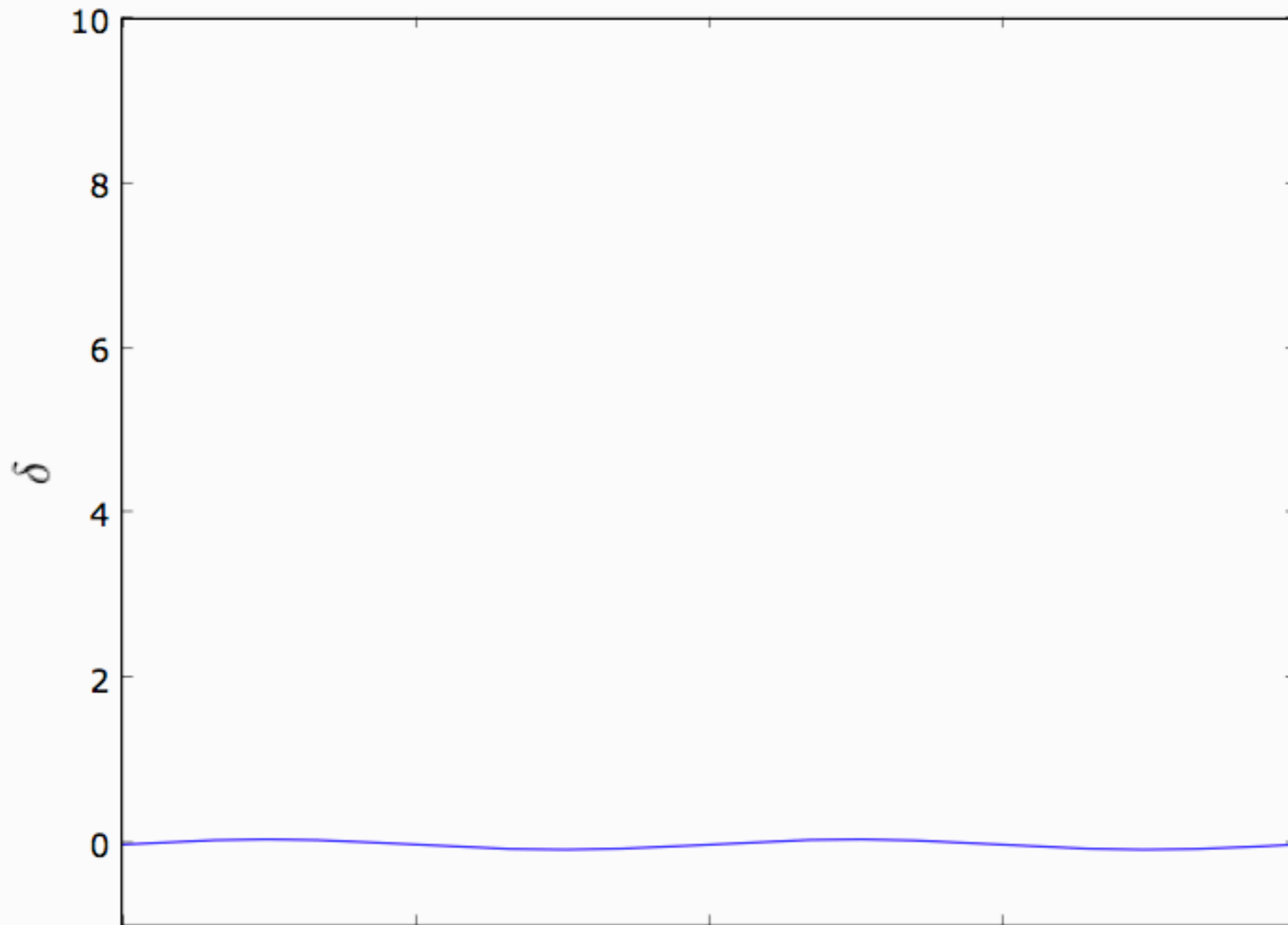
(simplest if really large, or really early)

Observations of the cosmic microwave background (WMAP, shown) tell us that the fluctuations in the early universe were  $\sim 10^{-5}$ , and Gaussian within measurement errors.

“Gaussian?” N-pt pdf depends only on 2-point correlation function,  $\xi(r)$ . Fourier amplitudes have all the useful information. 1-pt pdf on all smoothing scales is Gaussian.



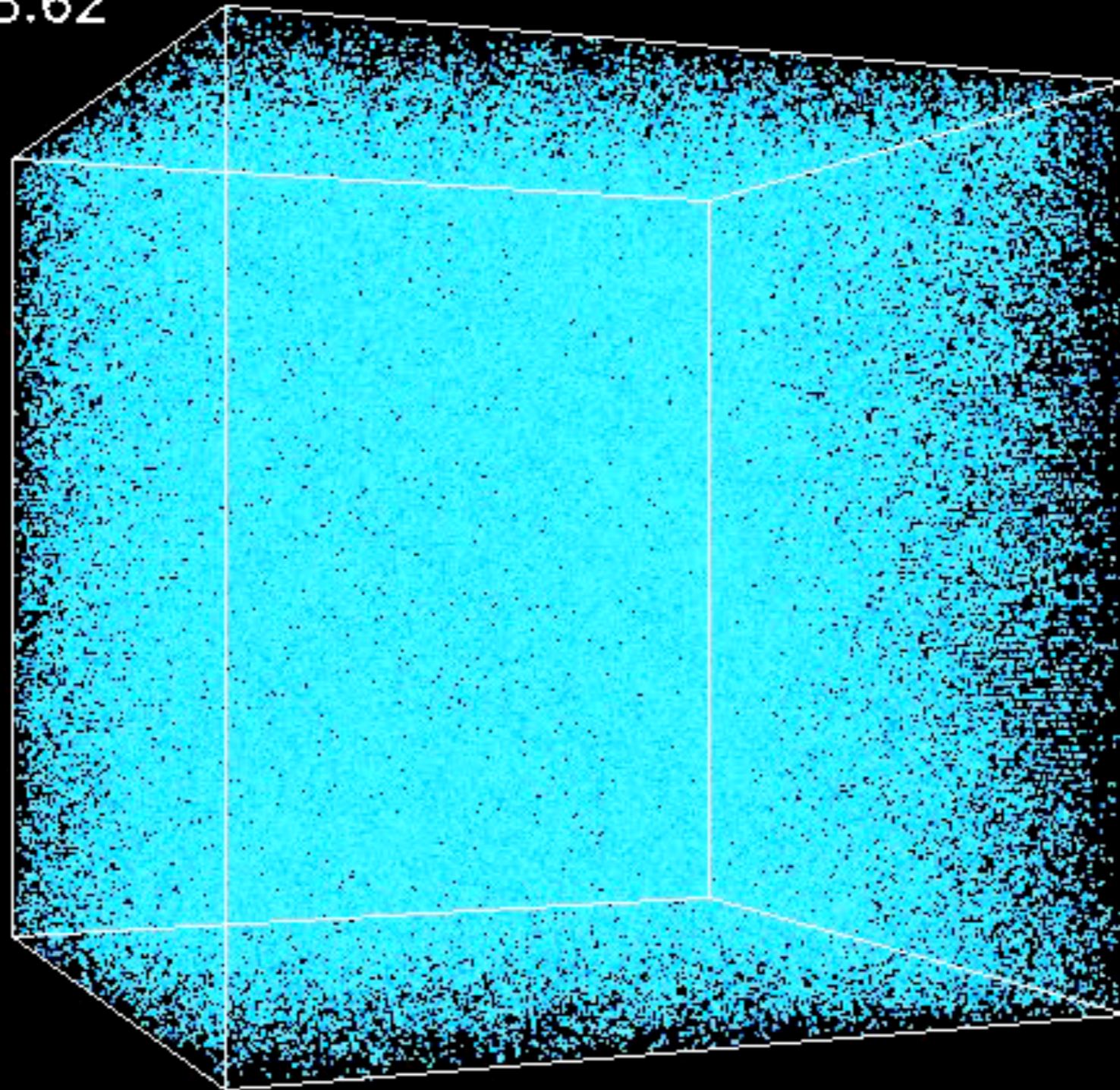






1d  $\rightarrow$  3d

$Z=28.62$



Kravtsov  
& Klypin

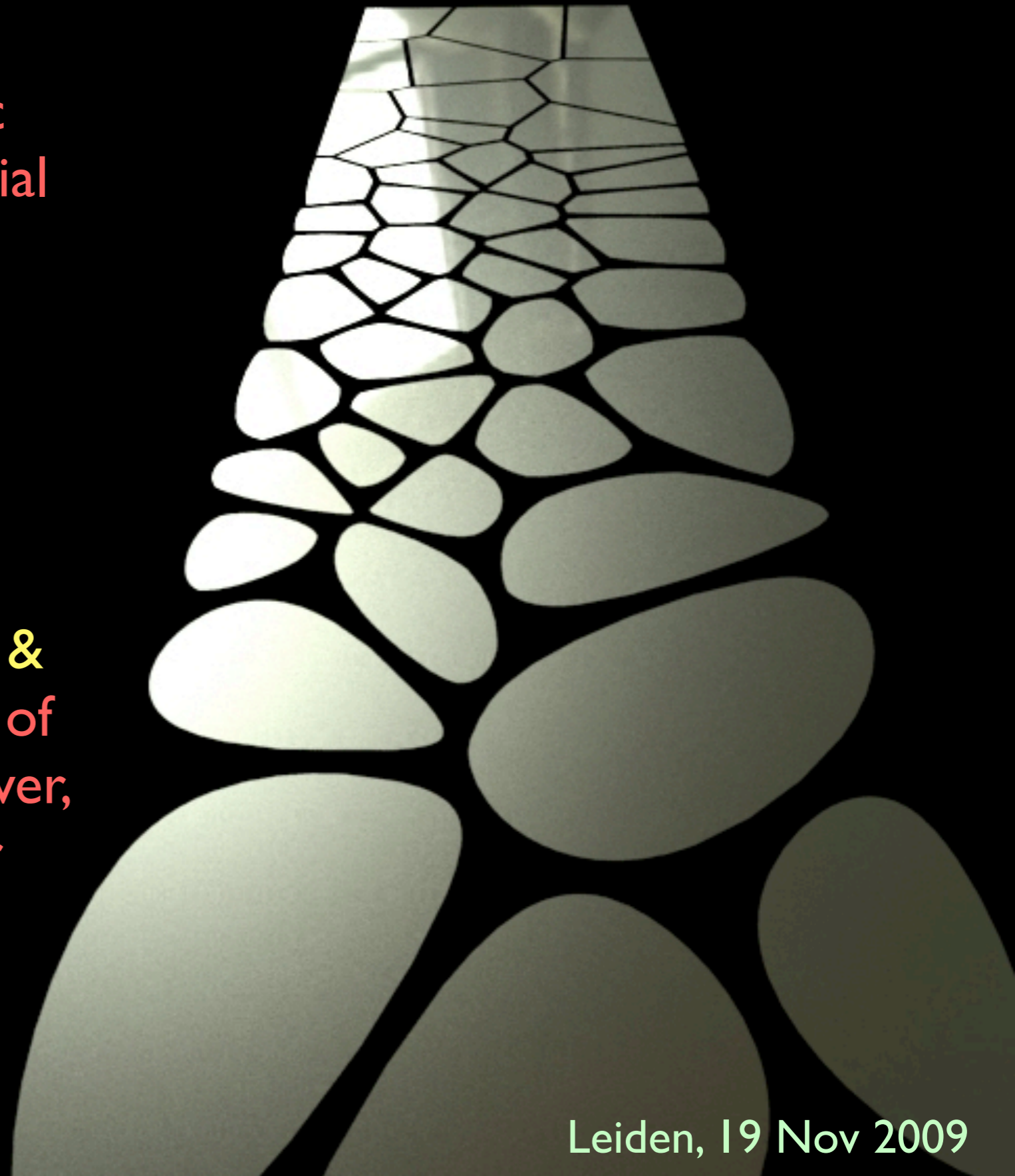
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# The Cosmic Web

Qualitative description of cosmic web: matter flows away from initial density depressions, collects at walls, filaments, and clusters. Density depressions are the generators of a Voronoi diagram: Voronoi vertices are clusters of galaxies, edges are filaments, and faces are walls (van de Weygaert & Icke 1989). Not bad description of 2-pt correlation function. However, full simulations still necessary for high accuracy, investigation of dependence on cosmological parameters.



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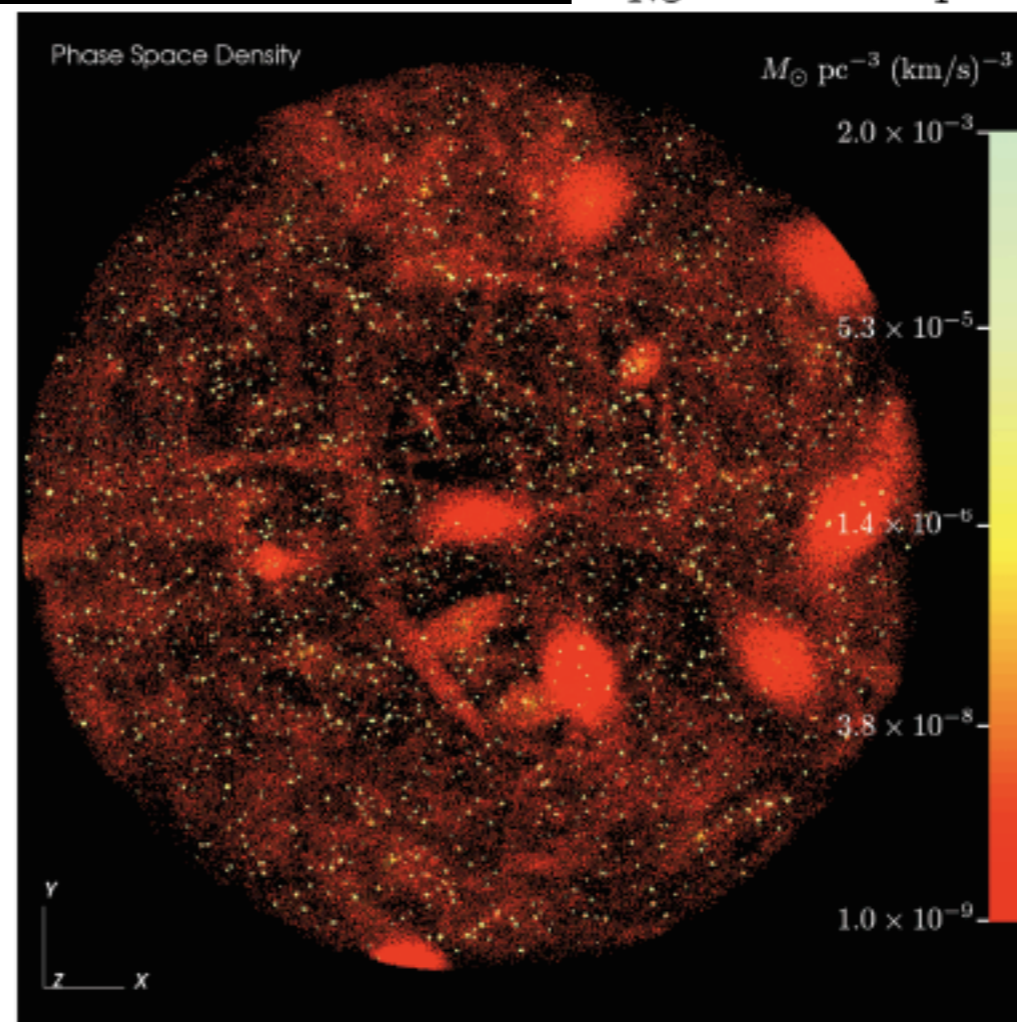
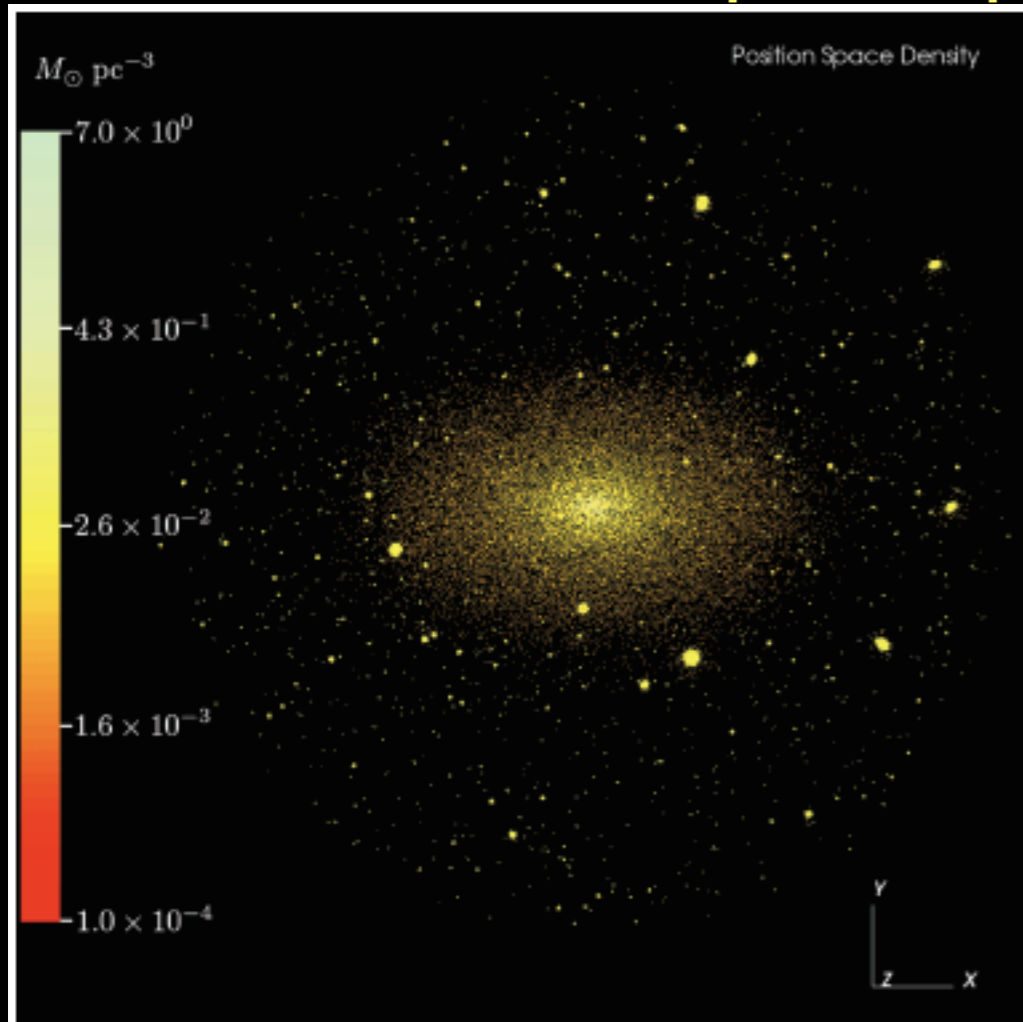
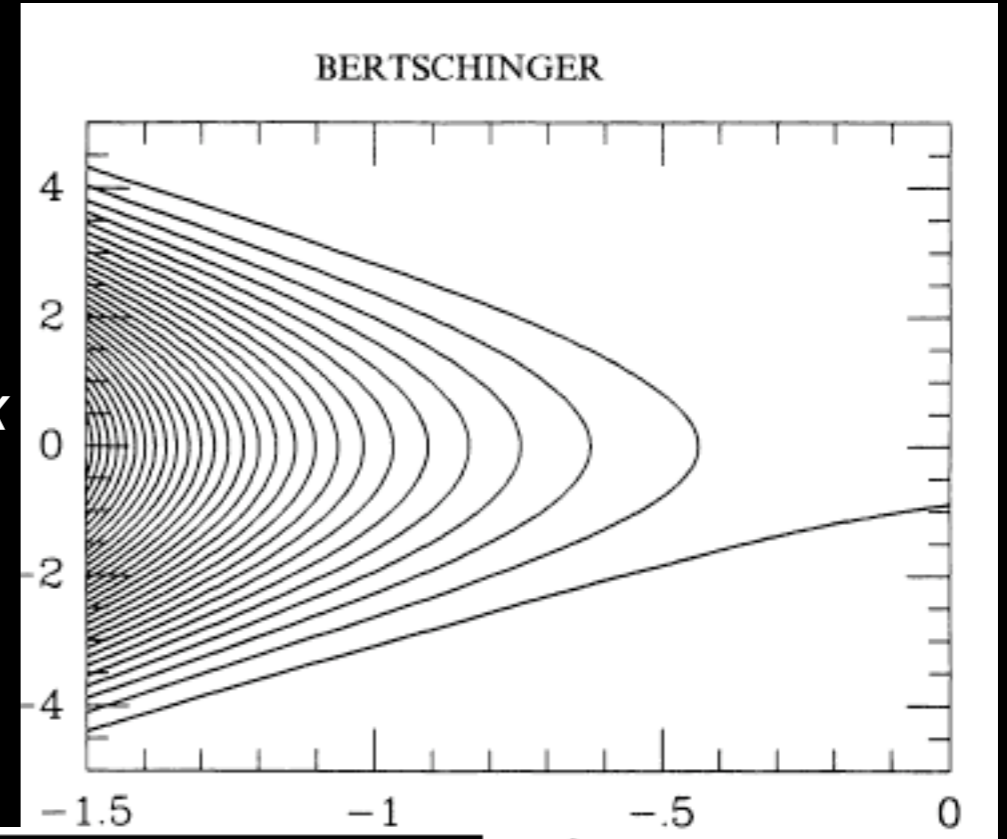


# The Cosmic Web

In fact 6D phase space, initial density depression zones likely curl into the interiors of non-linear structures.

Phase space tessellated almost entirely into  $v_x$  (non-Voronoi) regions defined by initial perturbations?

Large-scale filaments reach far into walls/filaments/clusters in phase space?



$\log x$

Zemp et al. 2009

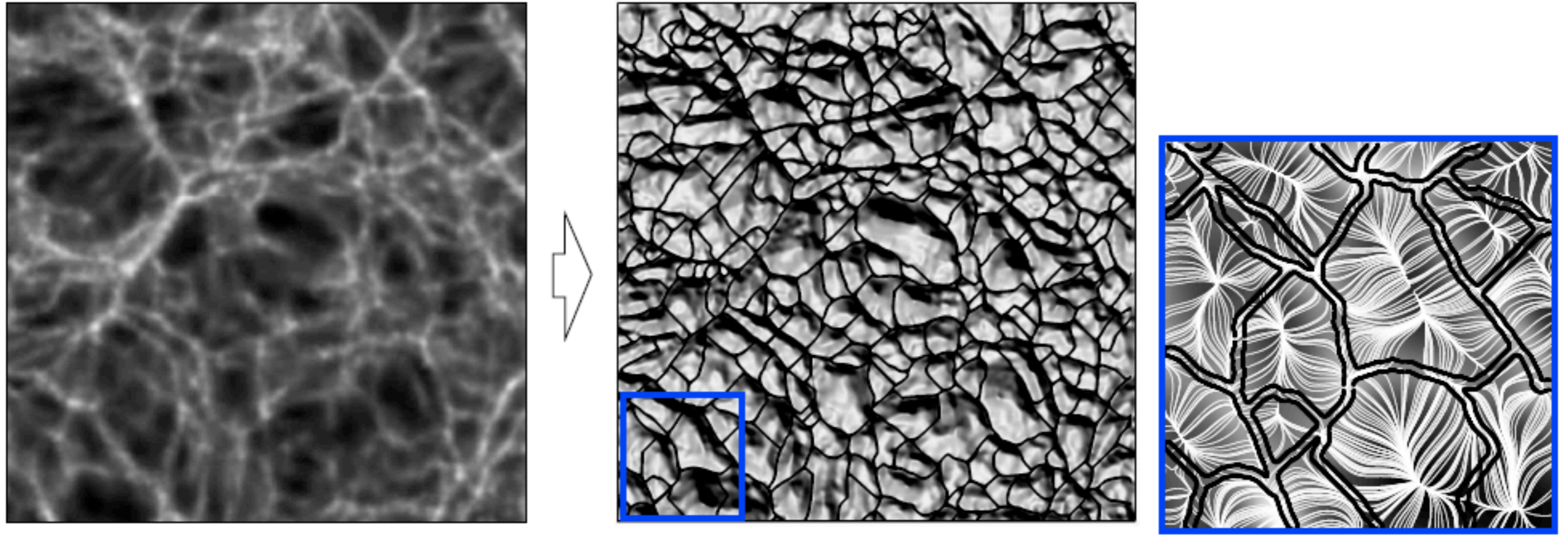


# Scales & Stats

Scale	Structure	Best Statistic
$\sim$ Hubble length, size of observable universe, $\sim 1$ Gpc	essentially homogeneous	(power spectrum)
$> \sim 10$ Mpc	Gaussian fluctuations	power spectrum
$\sim 4-10$ Mpc	“lognormal” fluctuations	power spectrum of log density
$< \sim 10$ Mpc	Cosmic Web	Void, filament, cluster stats
$< \sim 100$ kpc	cluster, filament, galaxy structure	?



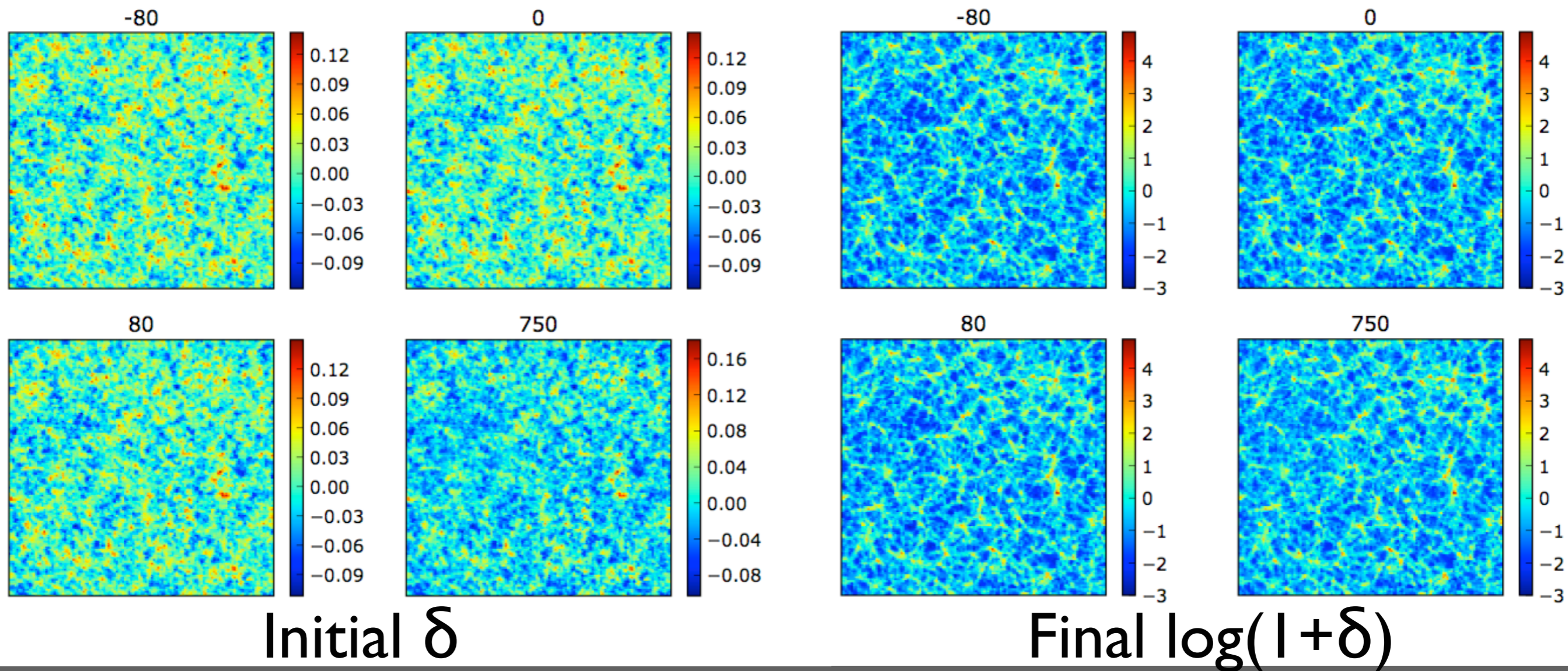
# Spine/Skeleton of the Cosmic Web



Total length of the spine depends somewhat on expansion history, matter content (Sousbie et al. 2006, Aragón-Calvo et al. 2008, Pogosyan et al. 2009)



# Balance between voids/clusters depends on initial non-Gaussianity



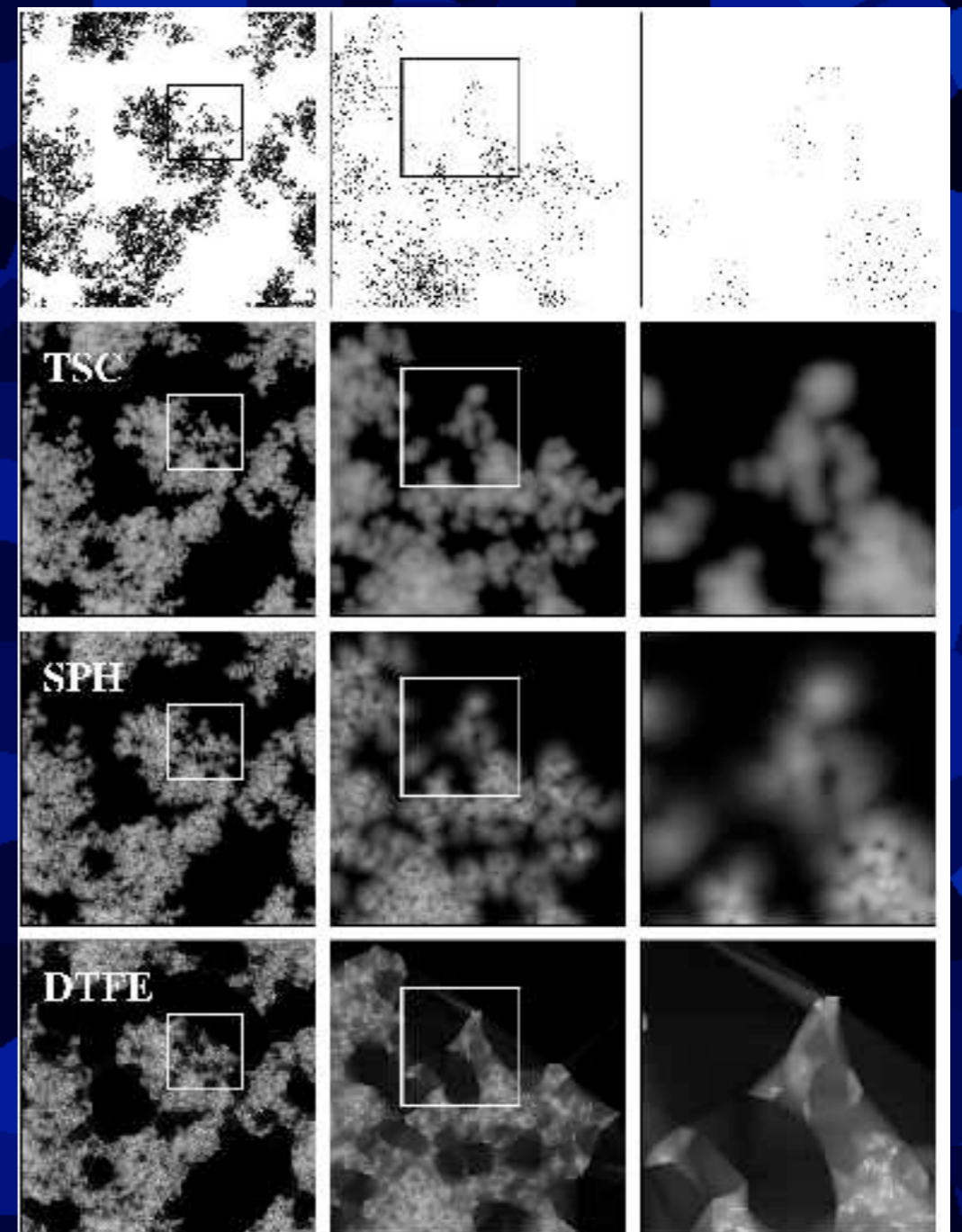
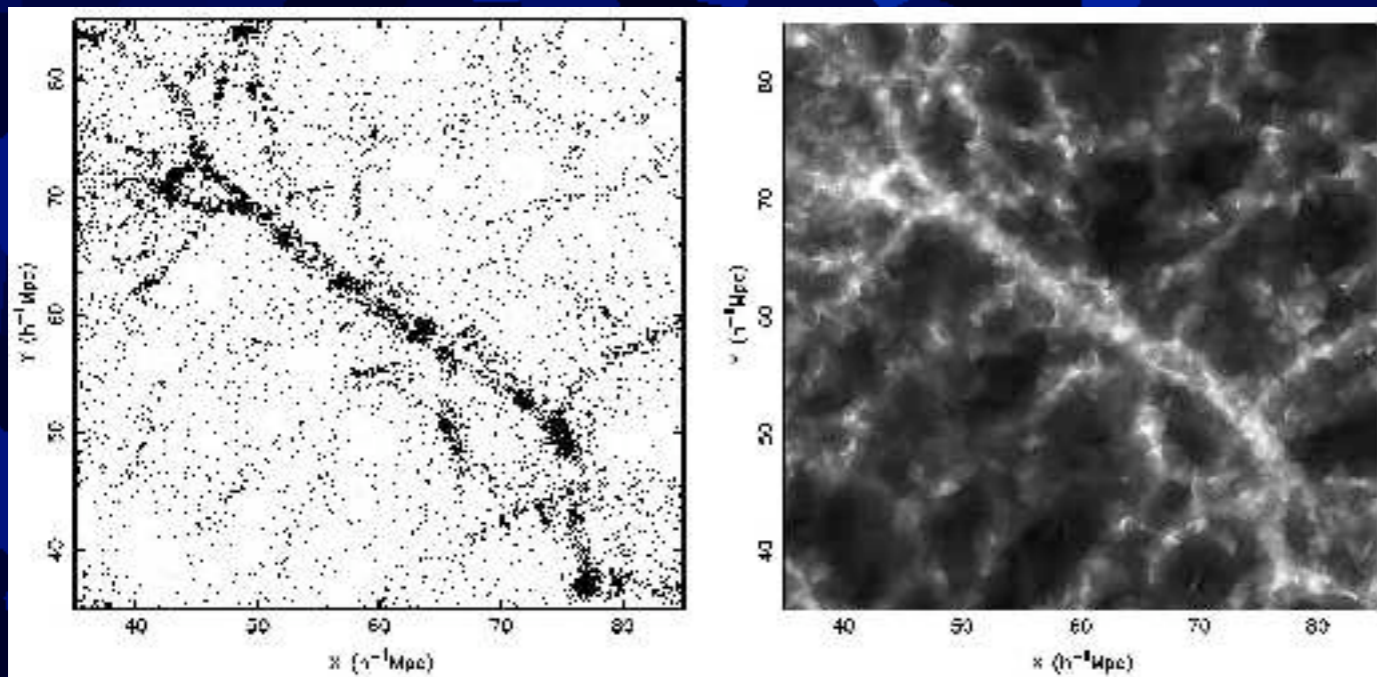
Simulations by Giannantonio, Porciani et al.



# II. Tessellation data analysis

Galaxies are assumed to be points from the view of large-scale structure. Tessellation methods naturally suited.

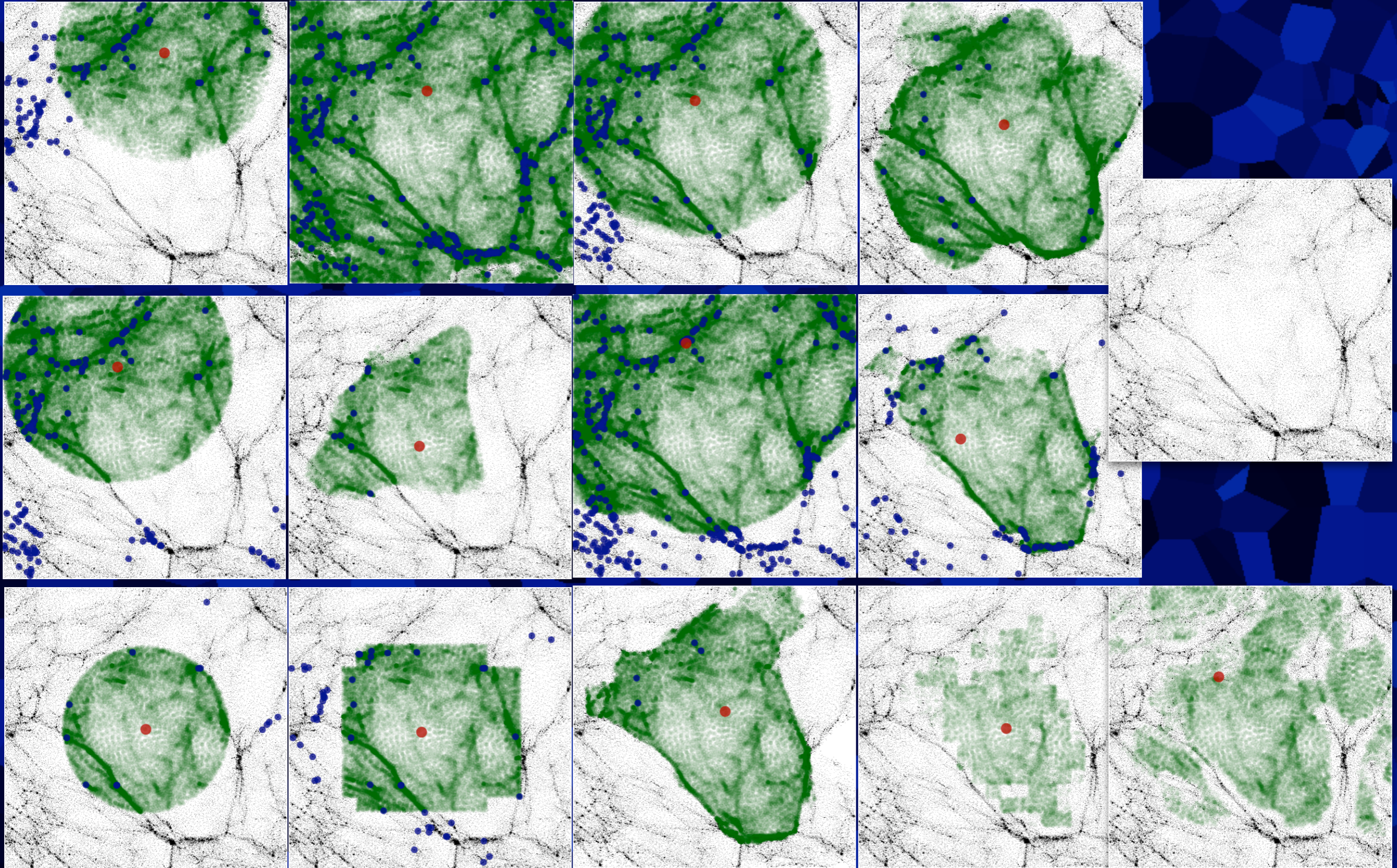
Delaunay, Voronoi Tessellation  
Field Estimators (DTFE, VTFE)  
VTFE measures densities exactly  
at galaxies; DTFE relatively easily  
to interpolate. (van de  
Weygaert, Schaap, Platen ...)





# Void, cluster finding

$$\frac{V}{Z} O B O \frac{Z}{V}$$

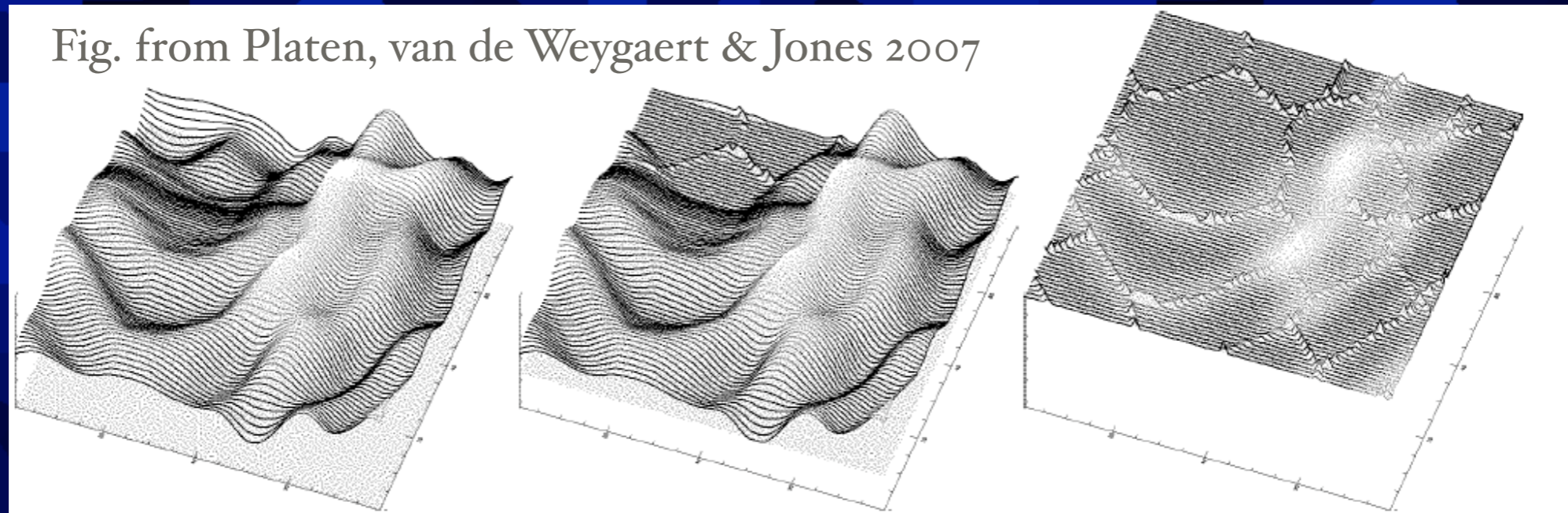




# Void, cluster finding:

$\frac{V}{Z} O B O \frac{Z}{V}$

Philosophy similar to Erwin Platen's Watershed Void Finder:

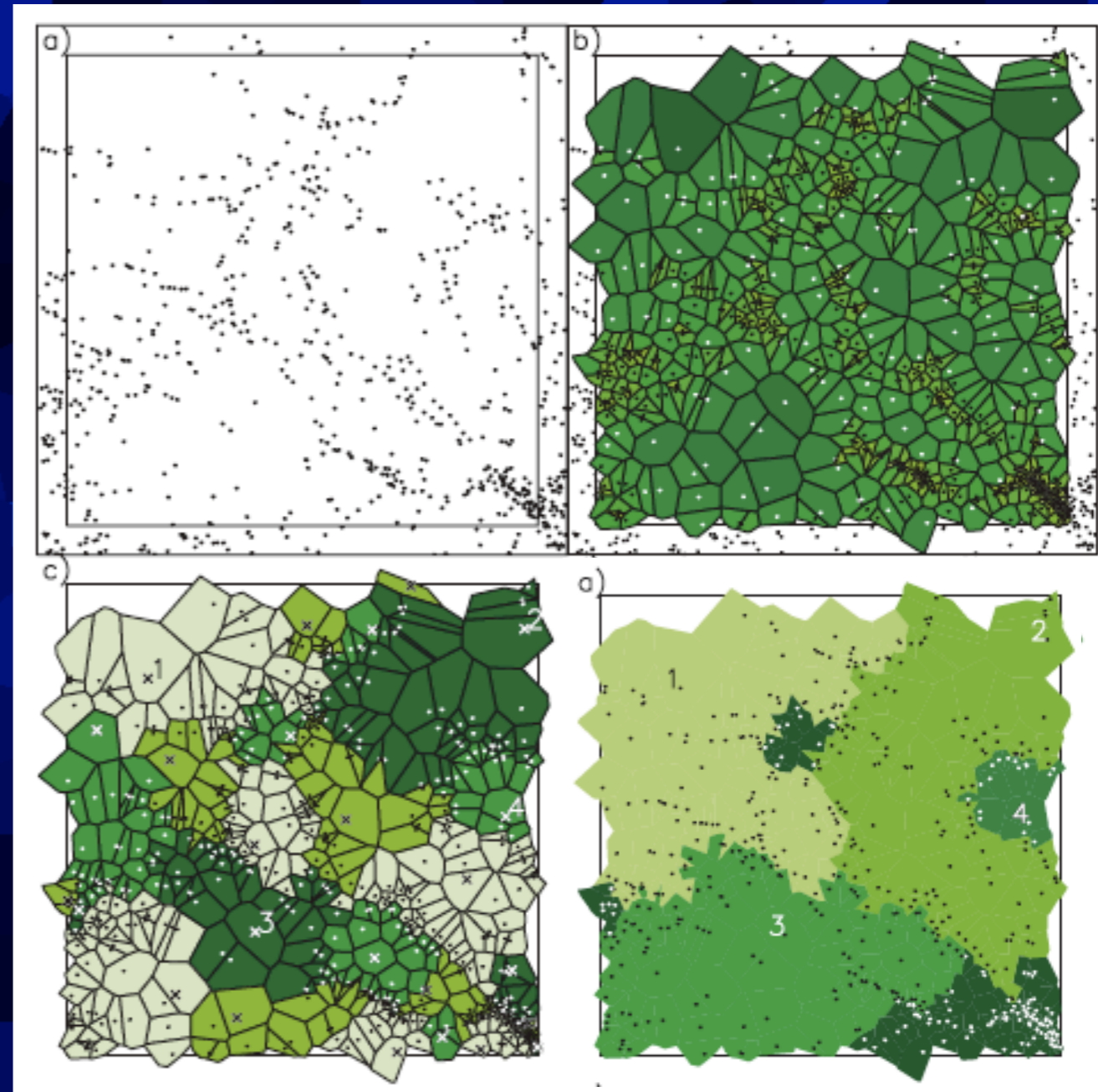
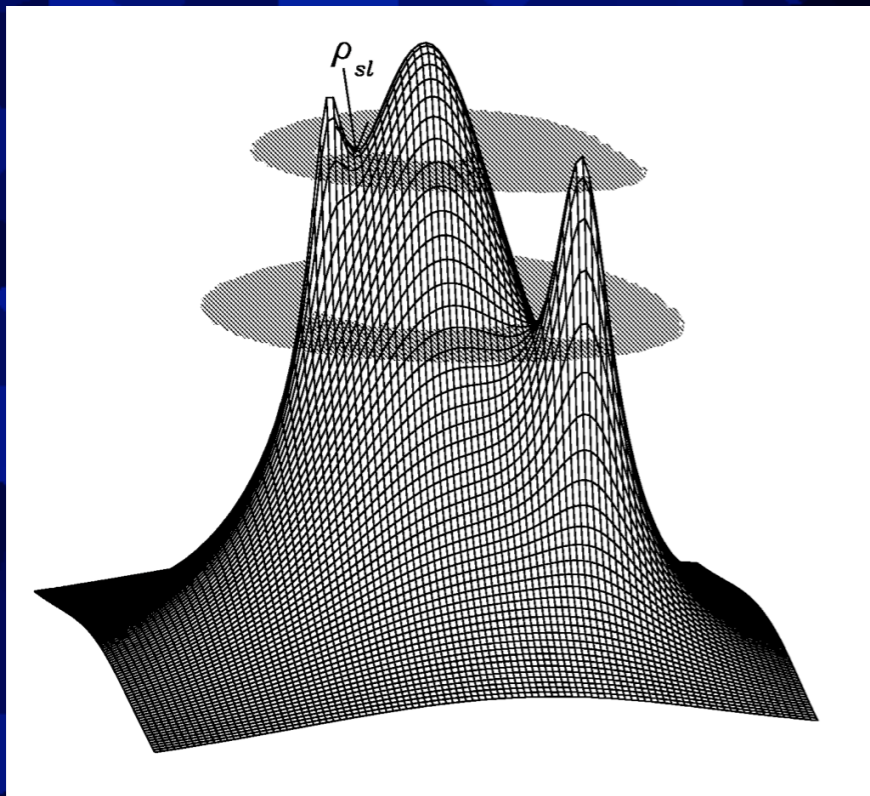


- \* Parameter-free (although so far for practical use I've used a density contrast/significance threshold)
- \* ZOBOV void/VOBOZ (Neyrinck, Gnedin & Hamilton 2005) cluster: catchment basin in the density field.
- \* "Water" flows along steepest gradients to Voronoi neighbors
- \* Freely available: <http://skysrv.pha.jhu.edu/~neyrinck/zobov>



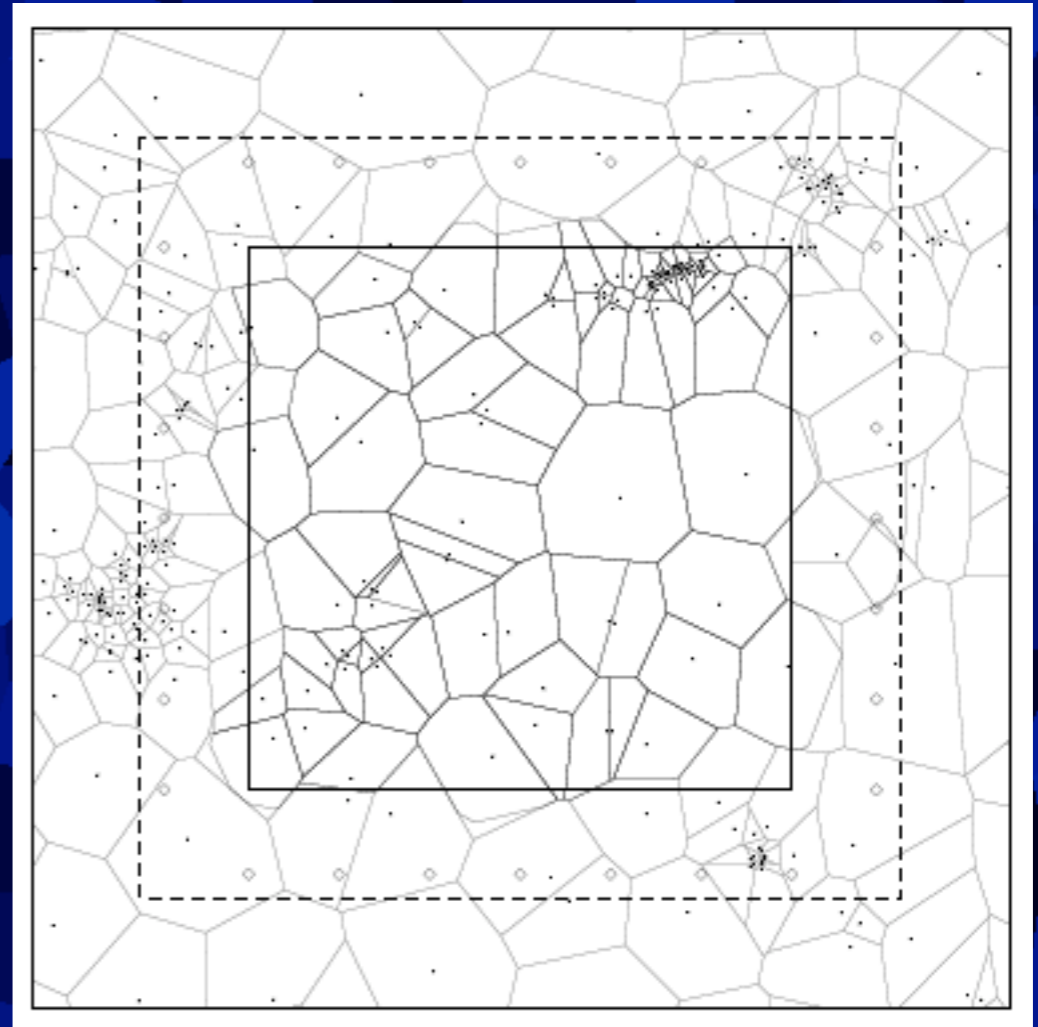
\* Measures probability (based on density contrast) that each void/cluster arose from discreteness noise. Spurious voids joined with deeper ones.

V O B O Z  
Z O B O V



V O B O Z  
Z O B O V

Maybe-interesting way to tessellate subboxes (could be applied to periodic boxes too): deploy “guard points” in a buffer around a region of interest that, if encountered as Voronoi adjacencies, signal that the buffer should be extended.

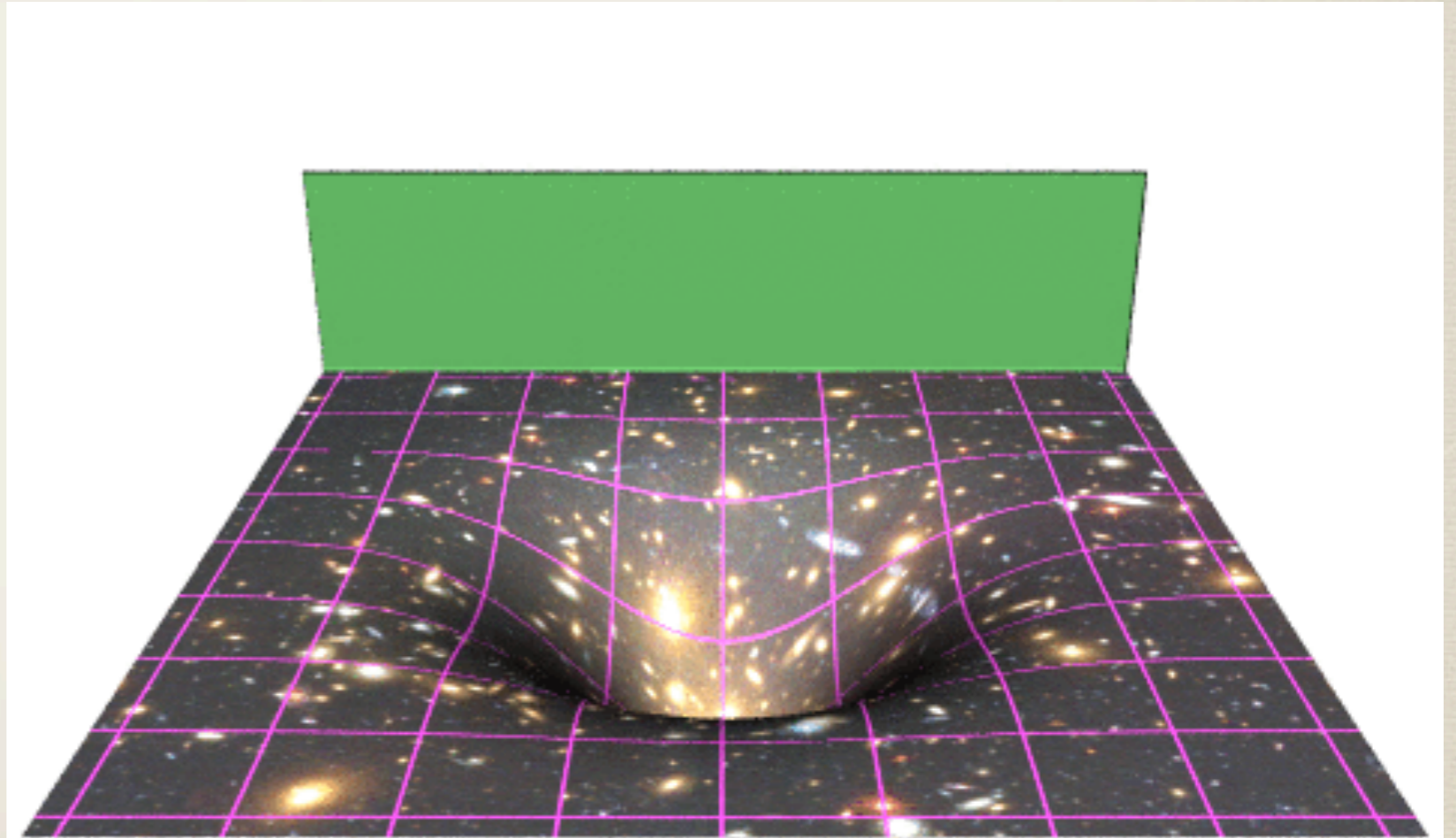




# Application of $\int_z^z \text{O} \text{B} \text{O} \frac{z}{v}$ :

Integrated Sachs-Wolfe (ISW) effect:  
unusually direct sign of “dark energy” /  
cosmic acceleration

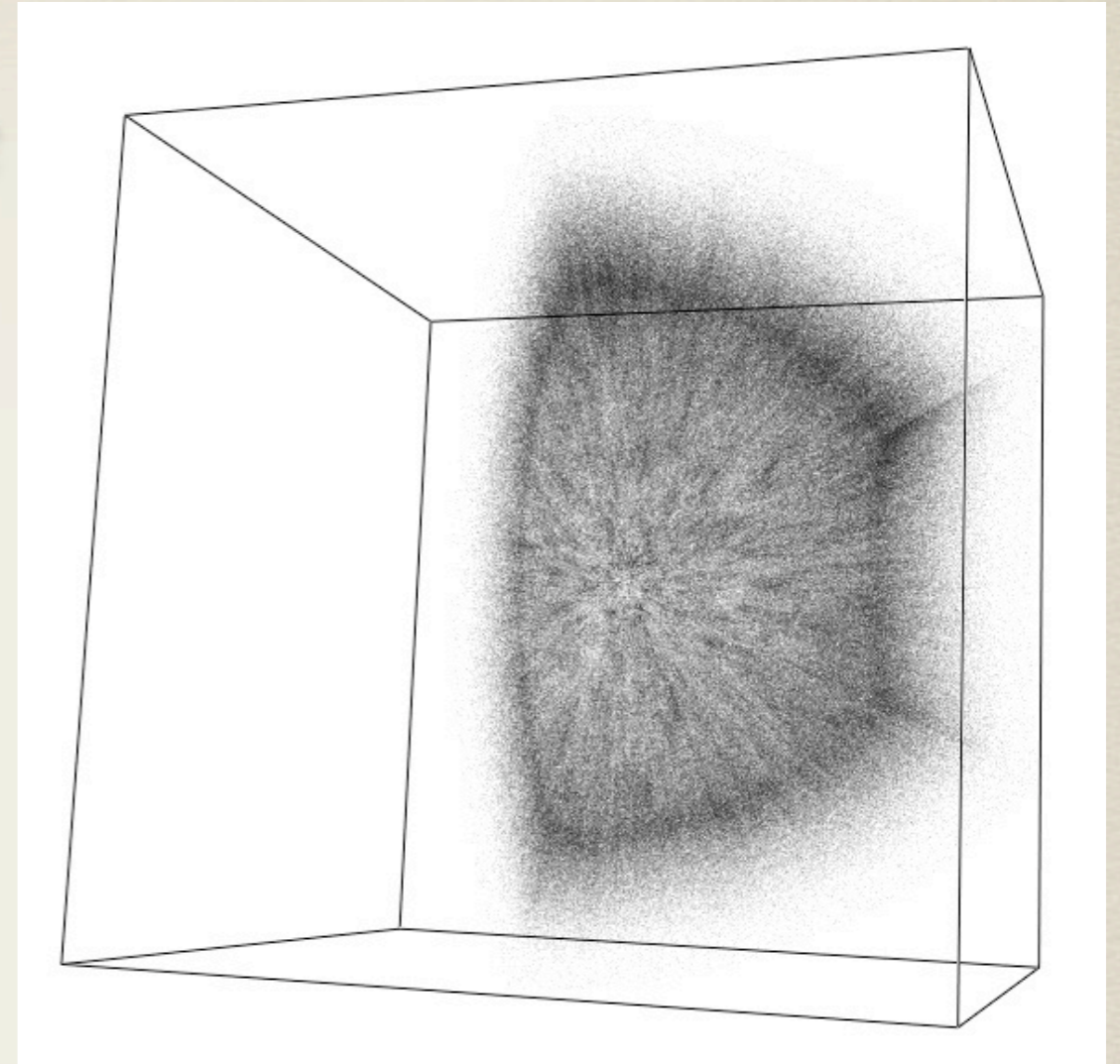
$$\frac{\Delta T_{\text{ISW}}}{T_{\text{CMB}}} = -2 \int d\tau \frac{d\Phi}{d\tau}$$



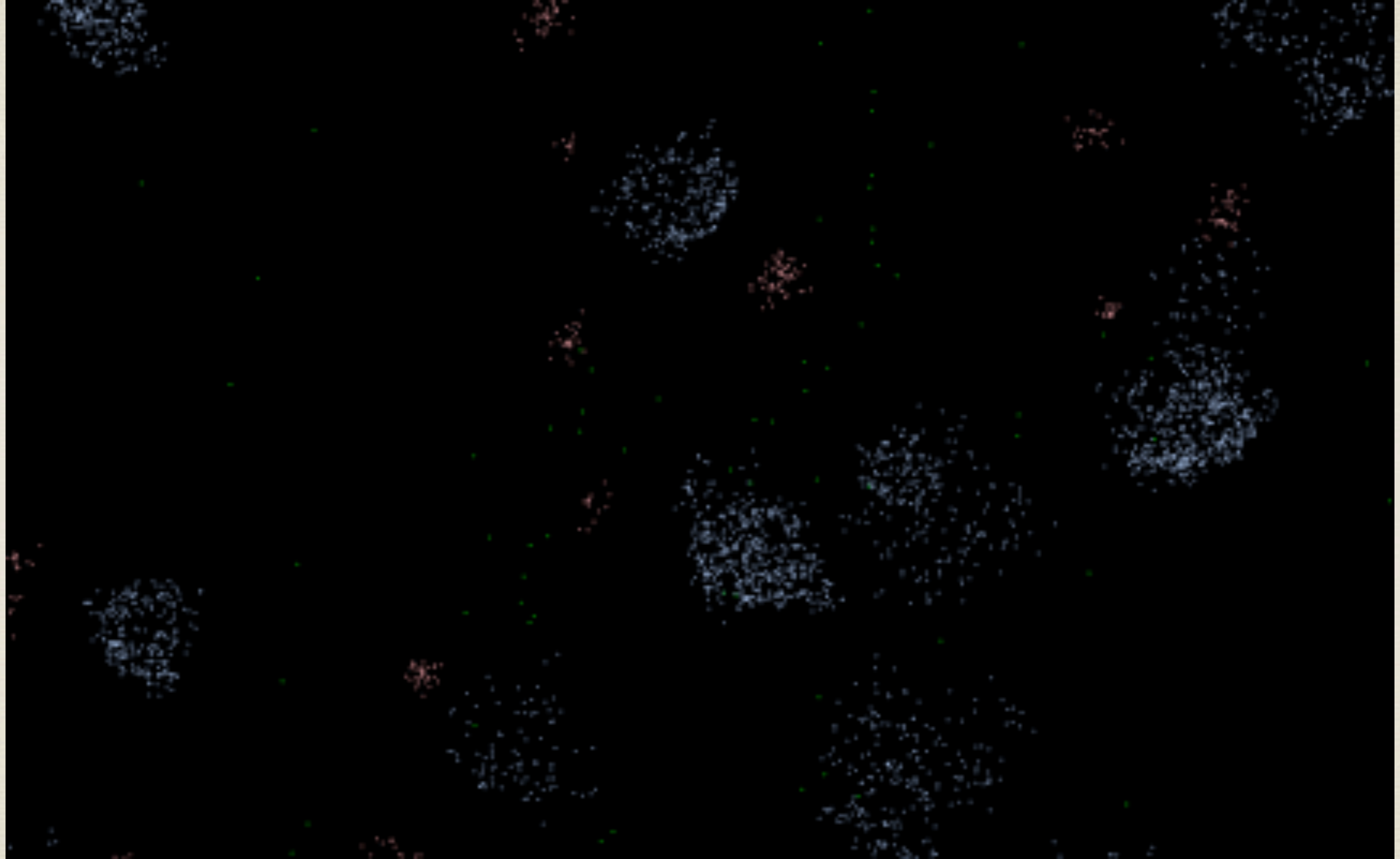


ISW effect has been measured using a cross-correlation function, but we detected it directly with voids/clusters of galaxies.

Used very bright “Luminous Red Galaxies” (LRG’s), sample a vast volume of  $\sim 4 \text{ Gpc}^3$

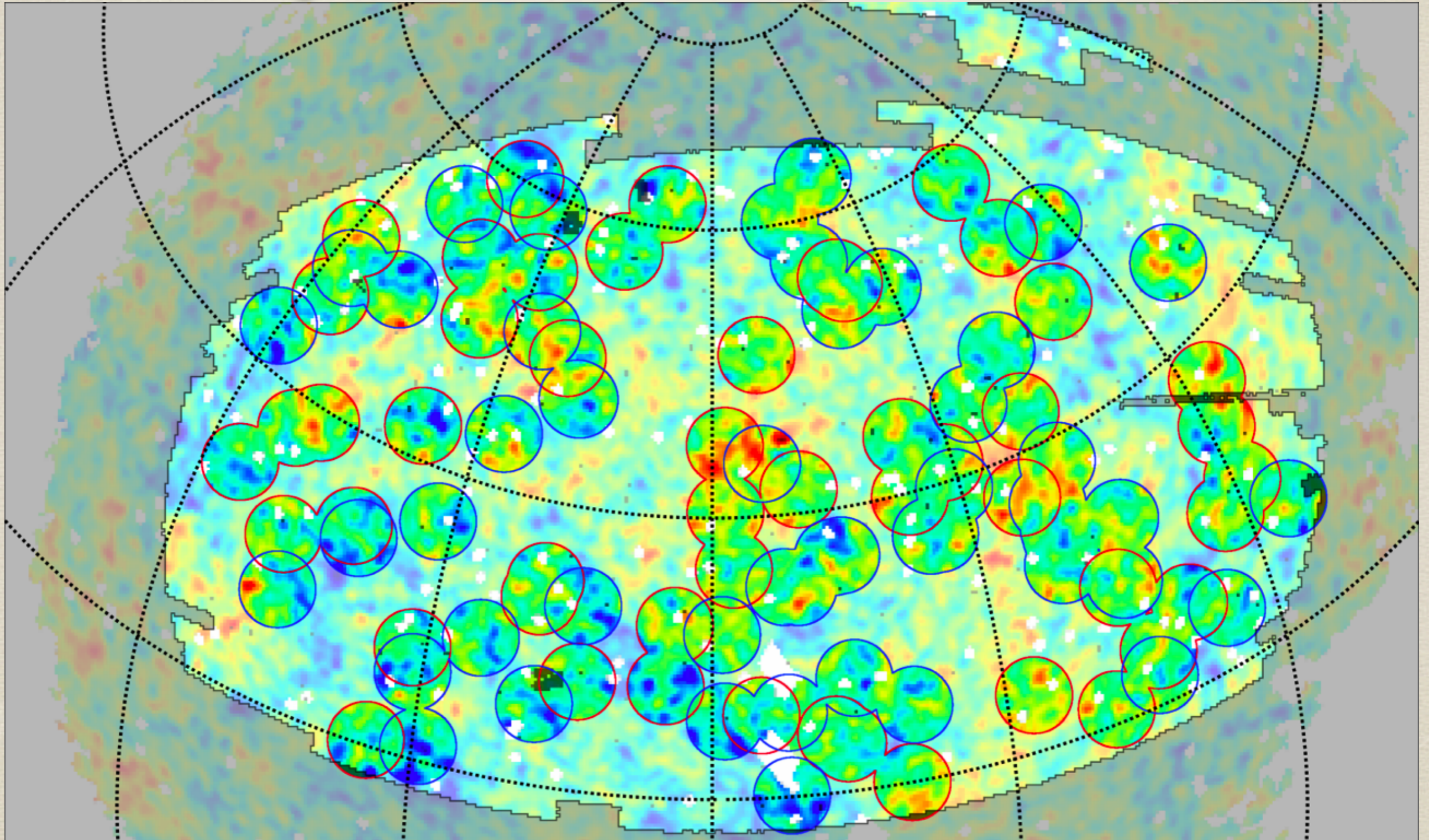






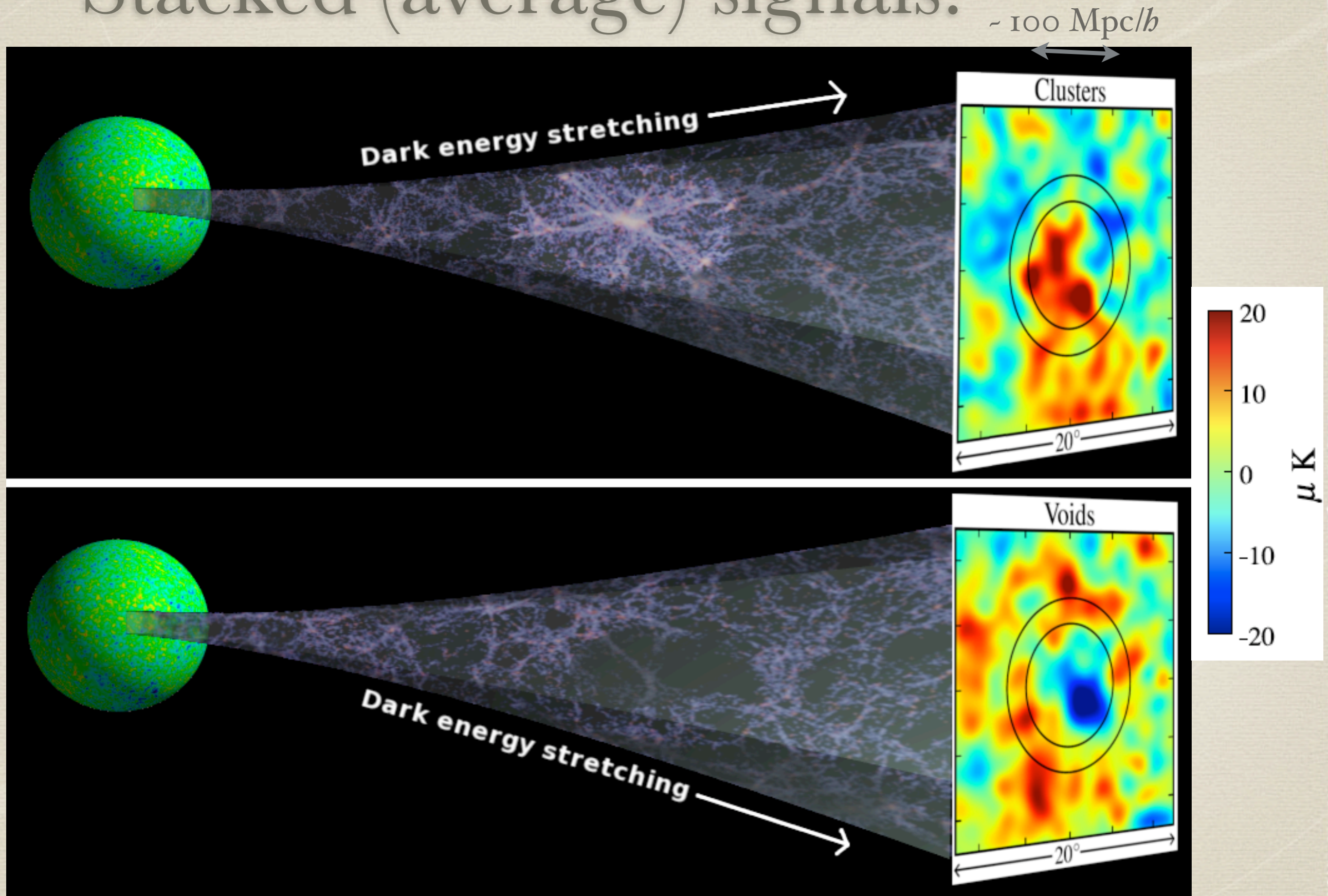


# CMB behind supervoids & superclusters





# Stacked (average) signals:



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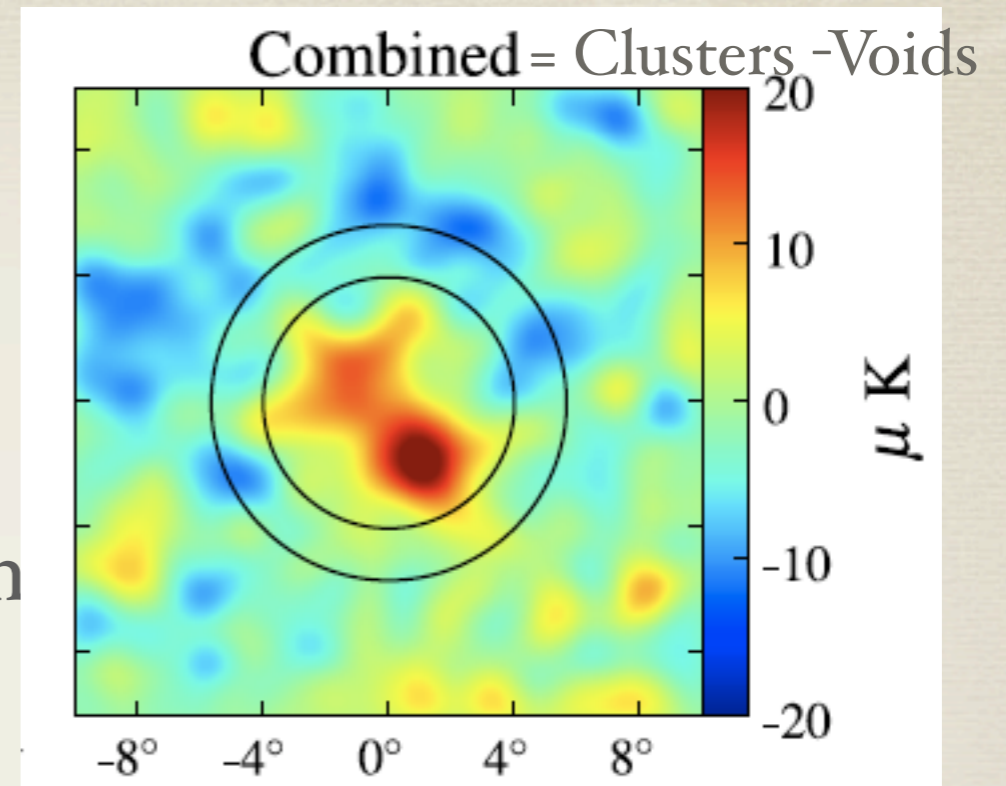
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# Statistical significance & details:

Granett, Neyrinck & Szapudi, ApJL, 0805.3695

- \*  $\sim 4\sigma$  detection from SDSS Luminous Red Galaxies
- \* Used top 50 supervoids, 50 superclusters (roughly a  $3\text{-}\sigma$  detection threshold). Too few wouldn't beat down "noise" (primordial CMB); too many would introduce dubious structures.



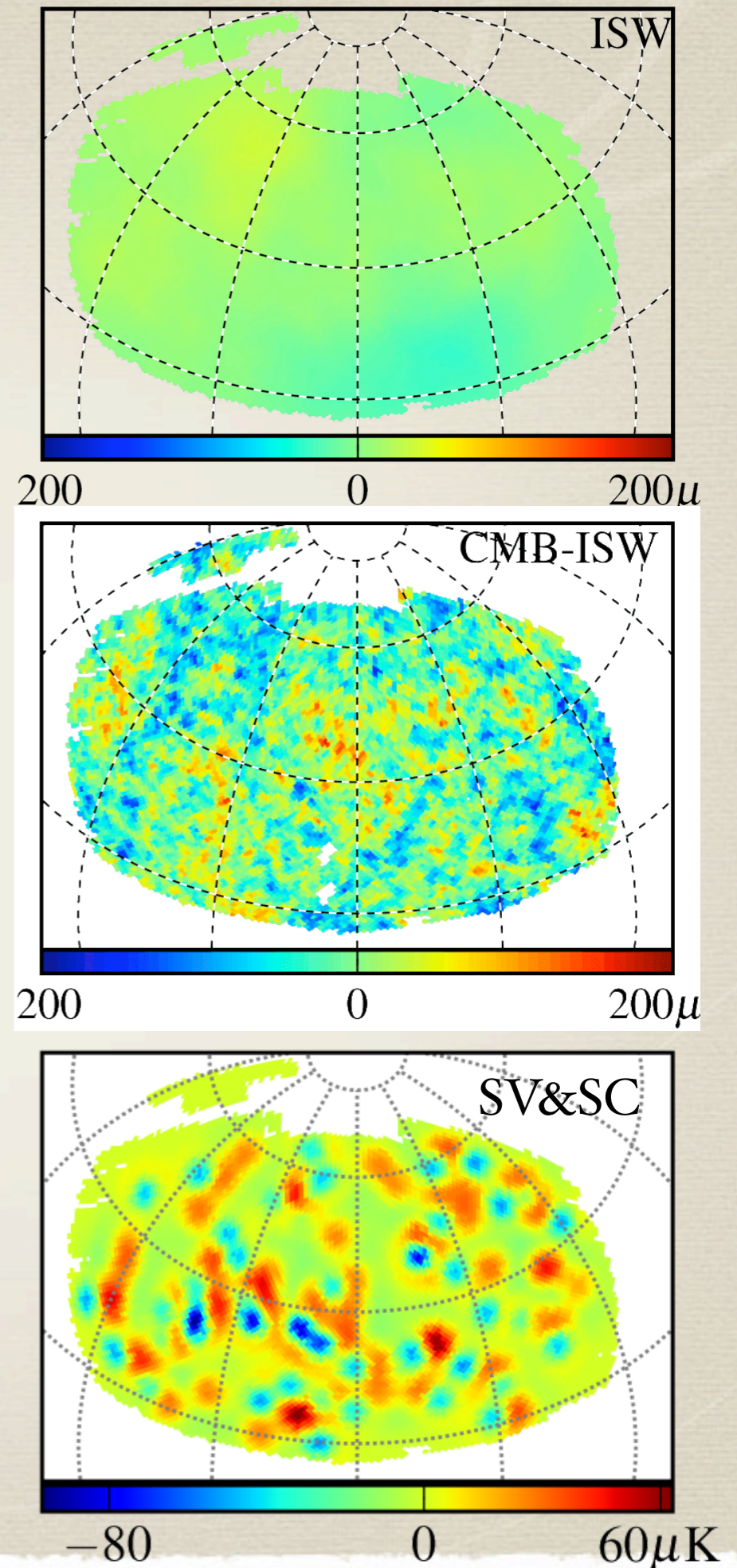


# Measuring the (linear theory) signal:

Granett, Neyrinck & Szapudi, ApJ 701, 414

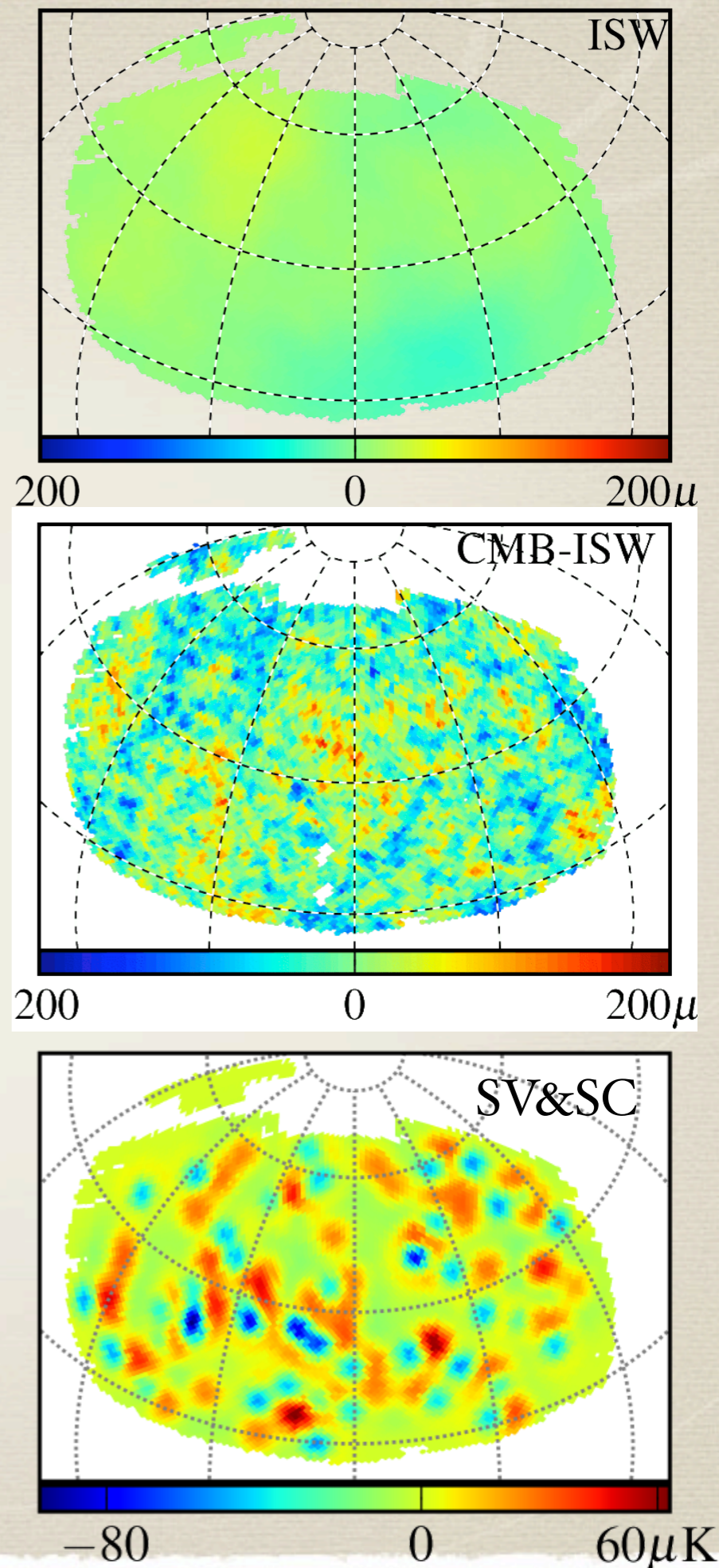
$$\begin{aligned}\Phi(\mathbf{r}) &= -\frac{G\rho_{\text{cr},0}\Omega_m}{c^2}(1+z_{\text{med}})\sum_i\frac{\delta_i V_i}{|\mathbf{r}-\mathbf{r}_i|}, \\ &= -\frac{G\rho_{\text{cr},0}\Omega_m}{c^2}(1+z_{\text{med}})\sum_i\frac{\bar{V}(z_i)-V_i}{|\mathbf{r}-\mathbf{r}_i|}.\end{aligned}$$

- \* Gravitational potential estimated from the 3D galaxy distribution
- \* Benefit of Voronoi tessellation: direct sum over galaxies, allowing true survey geometry to be used (unlike e.g. FFT methods)
- \* Small drawback: some galaxies on edges cannot be used





- \* Somewhat puzzling results: the signal we measured from supervoids and superclusters was hardly there in the potential reconstruction. Speculations:
  - \* large-scale voids, clusters more “powerful” (larger, deeper, more expansive, more nonlinear) on large scales than in the current cosmological paradigm?
  - \* Something dampens both visible light and microwaves that is not taken into account?

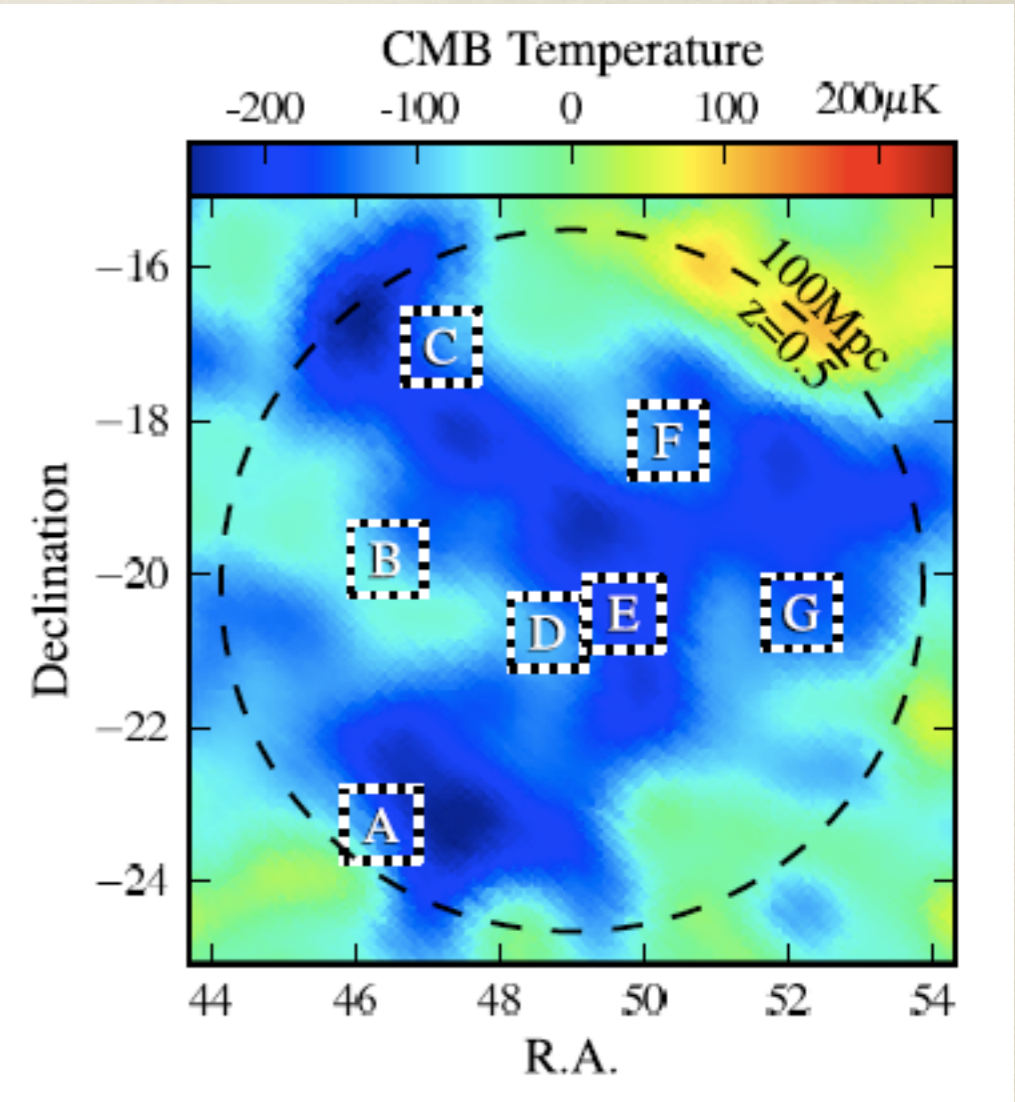




# CMB Cold Spot



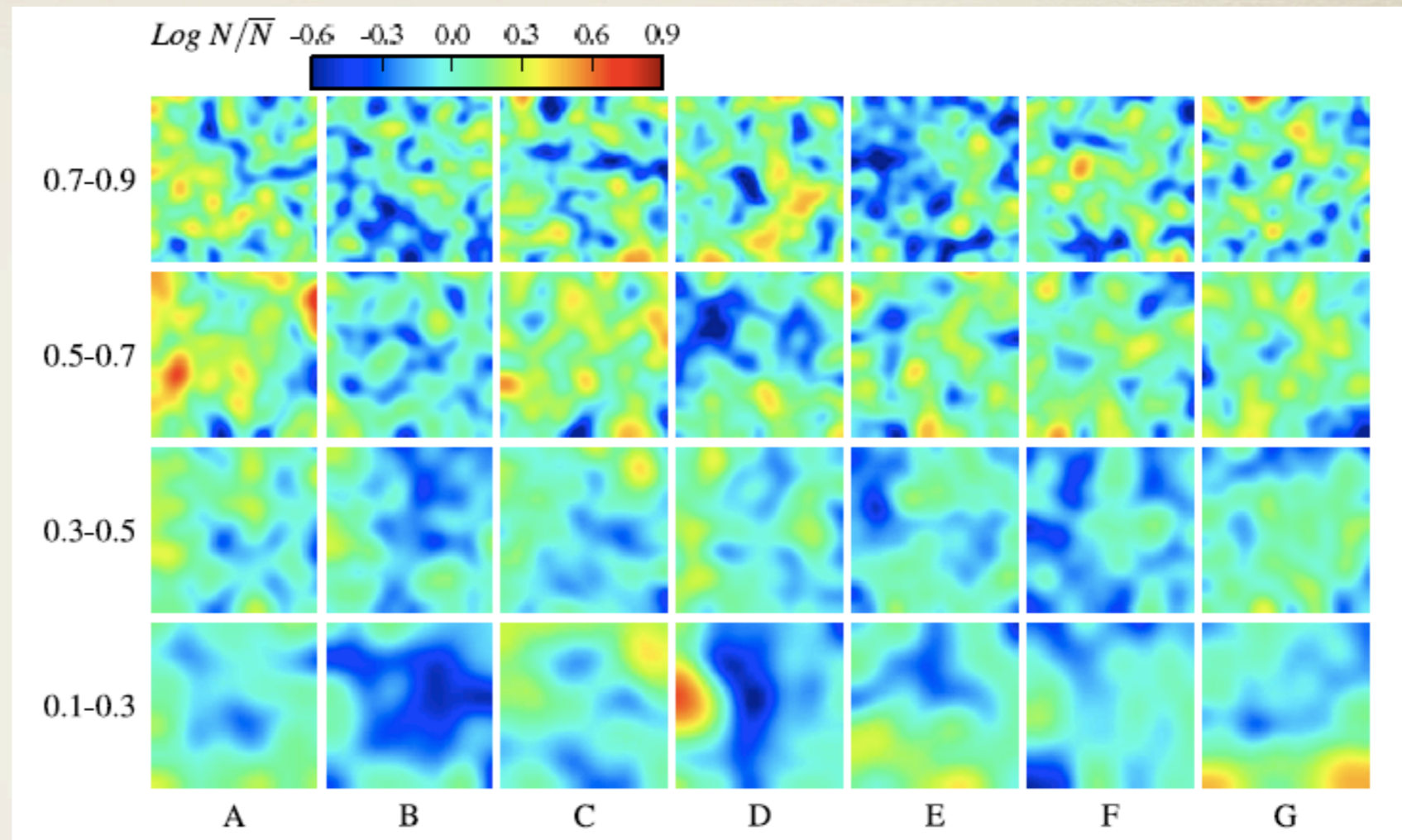
- \* A  $\sim 3$ -sigma cold, large fluctuation in the assumed Gaussian field of the CMB (e.g. Vielva et al. 2004)
- \* One possible explanation is a supervoid hinted at in radio galaxy observations (Rudnick et al. 2007), that got some news coverage
- \* No good galaxy surveys cover it (it's in the South), so we observed a few fields in it in Hawai`i.  
(Granett, Szapudi & Neyrinck; arXiv:0911.2223)





# CMB Cold Spot

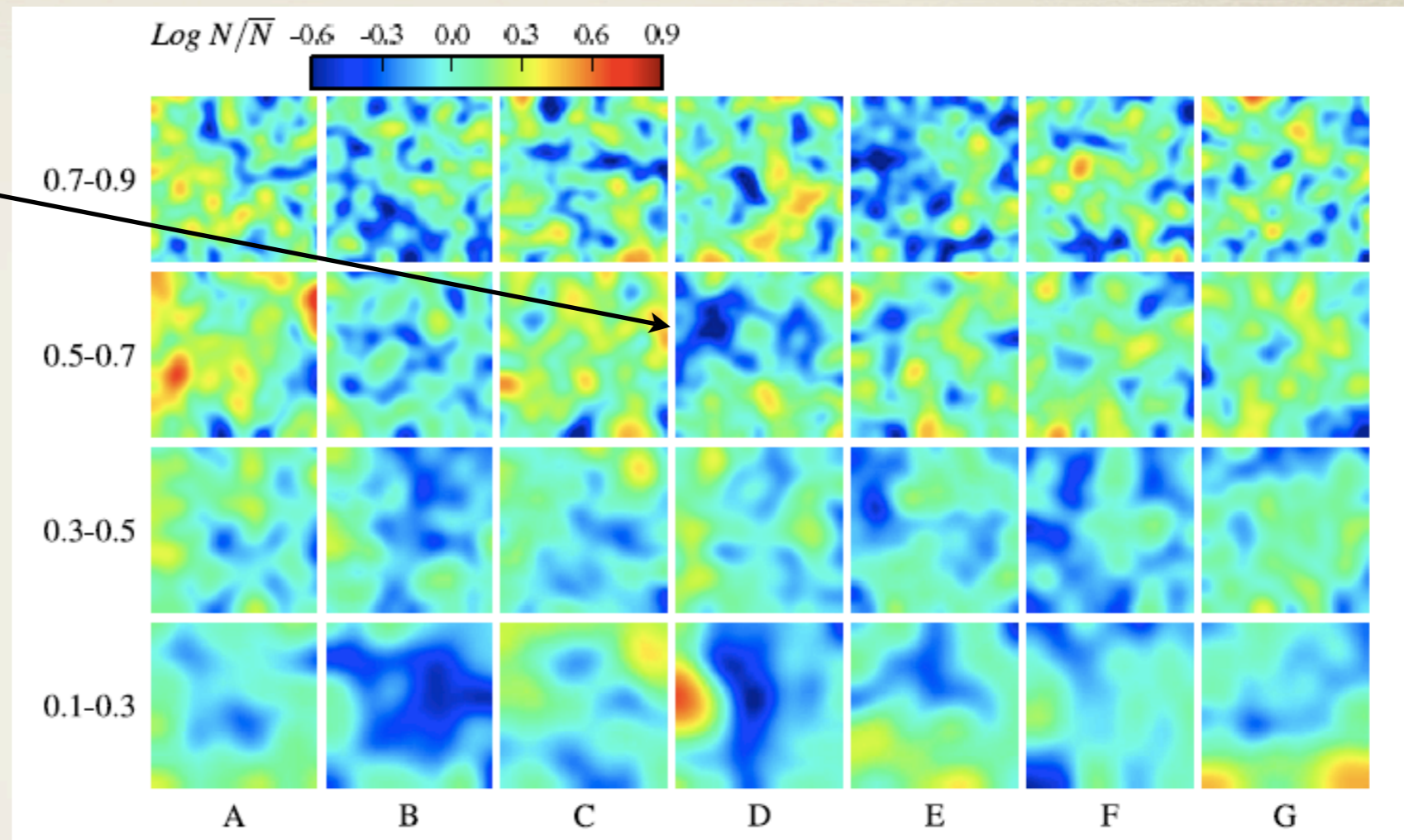
- \* Somewhat unfortunate geometry of each pencil beam:  $1^\circ$  square.  $\sim 3$  Gpc long!
- \* To use a Voronoi tessellation, we distorted the pencil beam into a unit cube. (Still,  $1/2$  of galaxies thrown out)
- \* Treats 3 dimensions equally; not a bad approximation since the distance errors are very large.





# CMB Cold Spot

\* ZOBOV did detect the void in field D, as the deepest void in all fields (these + 15 control fields). But (probably) not a supervoid!



\* a hint of underclustering/underdensity in the cold spot, but nothing dramatic

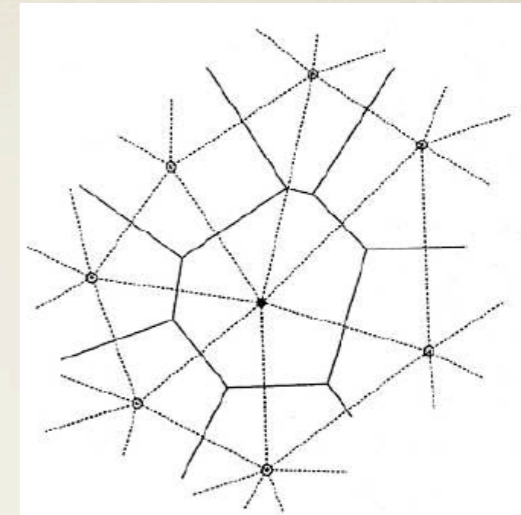


# Measuring $\text{div}(\mathbf{q})$

- \*  $\mathbf{q}$  = Lagrangian displacement of particles between initial, final coordinates
- \* Used Delaunay-based estimator for  $\text{div}(\mathbf{q})$ :

$$\nabla \cdot \mathbf{q} = \frac{1}{\sum_i V_i} \sum_i A_i \mathbf{q}_i \cdot \hat{\mathbf{n}}_i$$

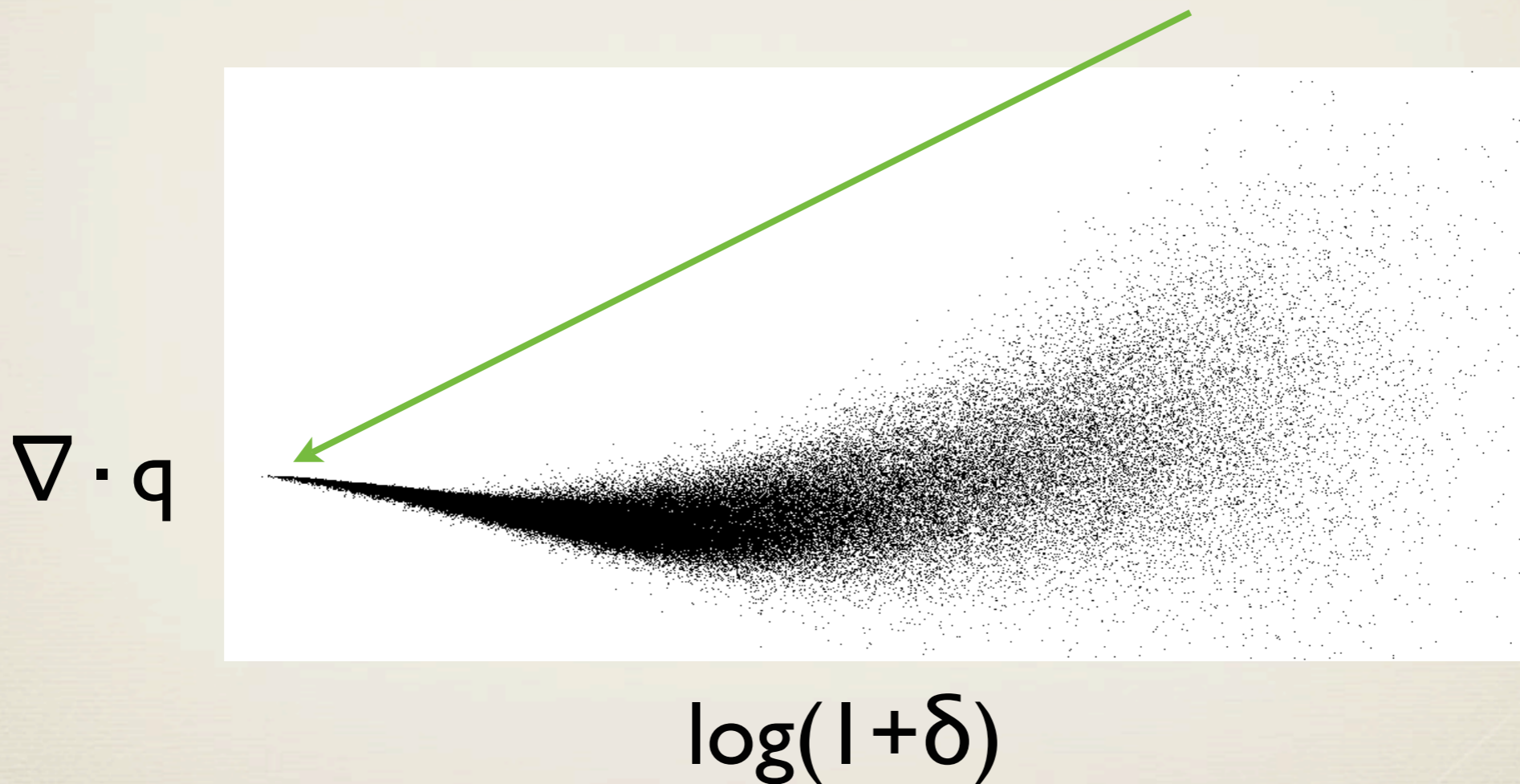
- \* Voronoi-based estimators less sensitive to changes in the tessellation, but this seems ok given a snapshot.
- \* Strange property: doesn't depend on  $\mathbf{q}$  at the point in question (like measuring a derivative using  $x+h, x-h$ )





# Measuring $\text{div}(\mathbf{q})$

- \* Preliminary results: scatter plot of particles.
- \* I wouldn't know how to get low-density tail (that has the nice relationship) without tessellations.





# Conclusion

Tessellations are an essential tool for large-scale structure and cosmology.

Useful both for physical models, and for data analysis, since large-scale structure data usually consists of points