

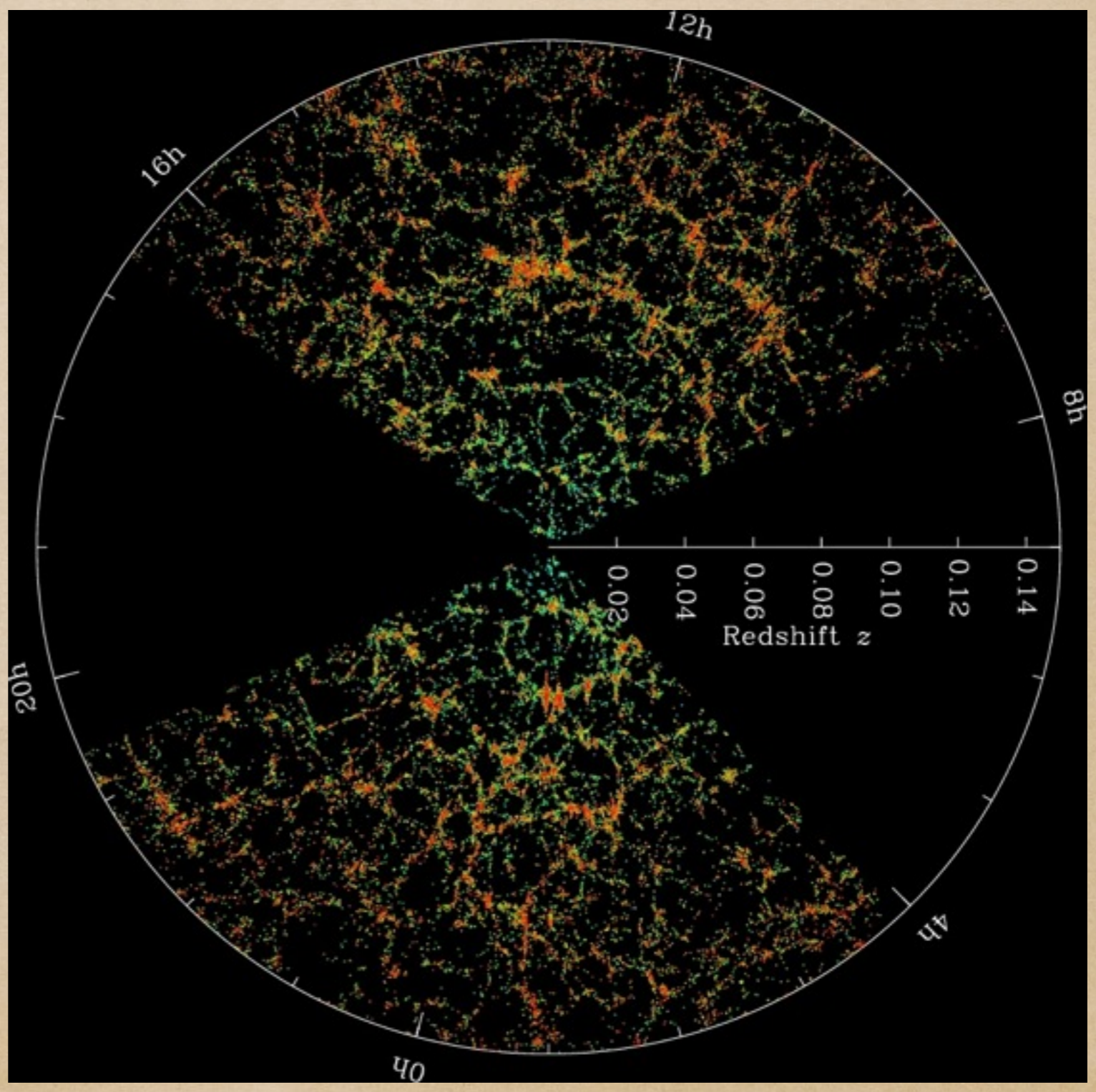
Adaptive density estimator  
for galaxy surveys

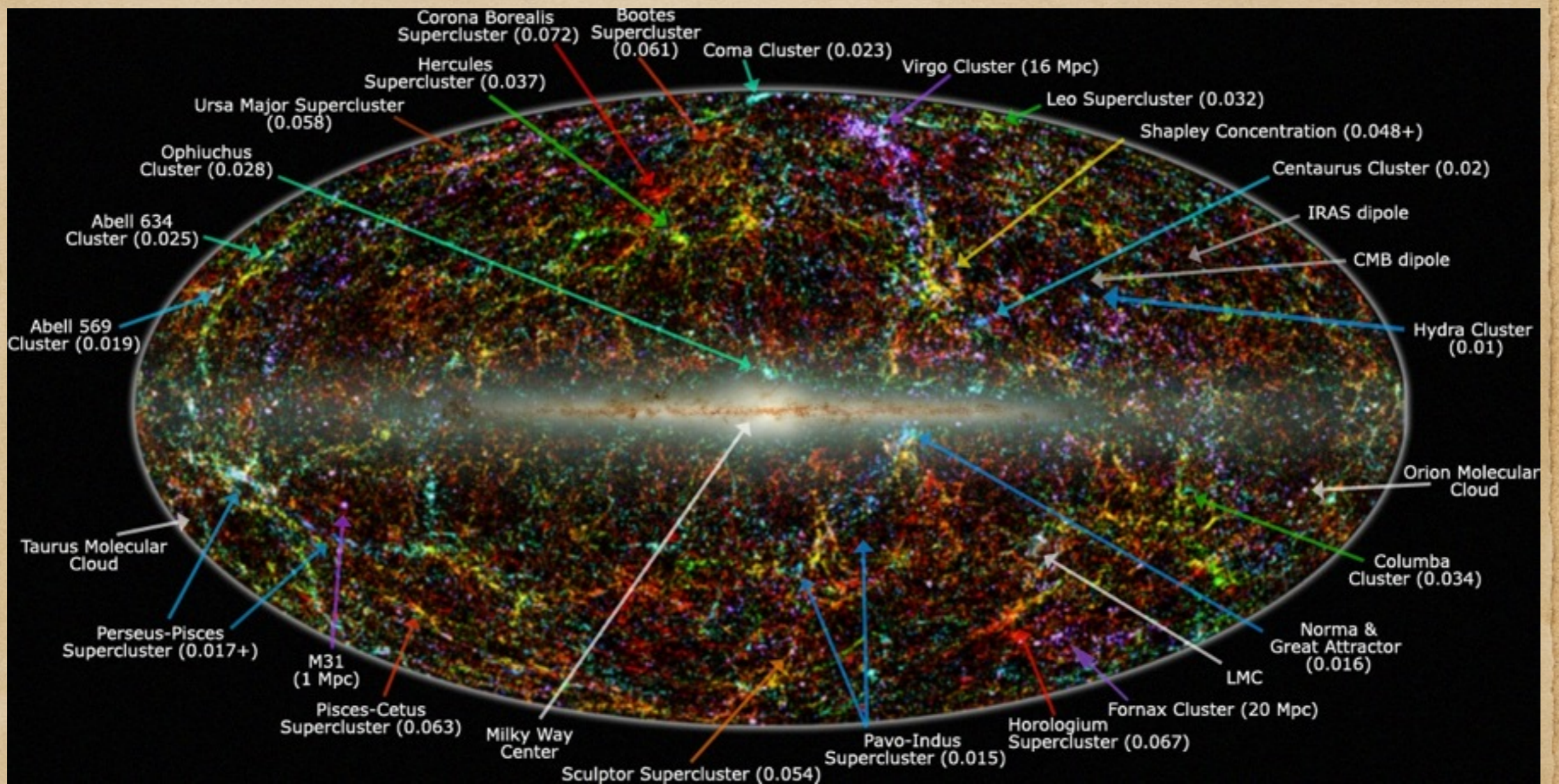
Enn Saar, Tartu Observatory

Tallinn, 26.06.2014

# The Bright Universe

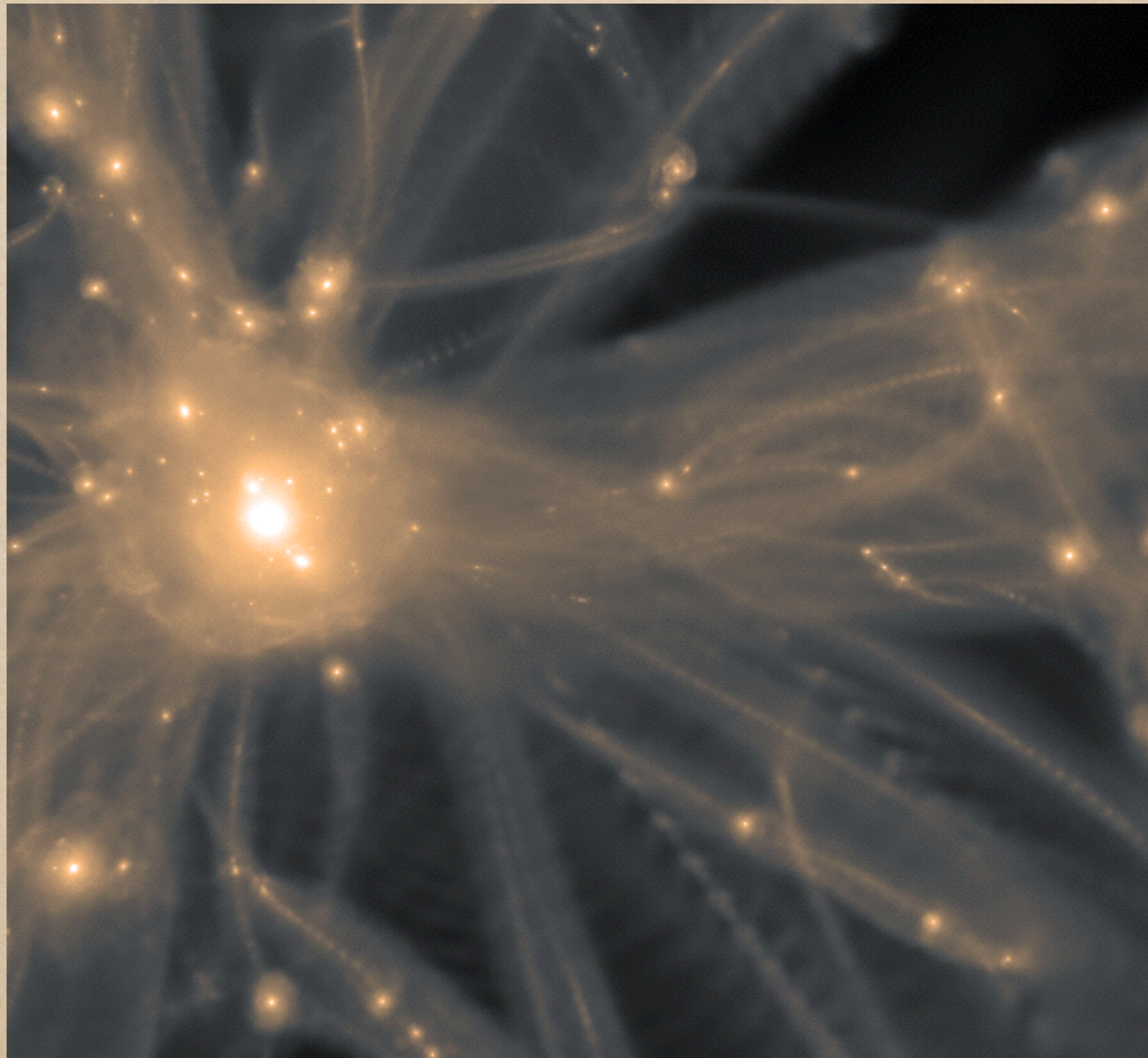
SDSS





2MASS sky

# The Dark Universe



Tom Abel

# Bayesian density builder

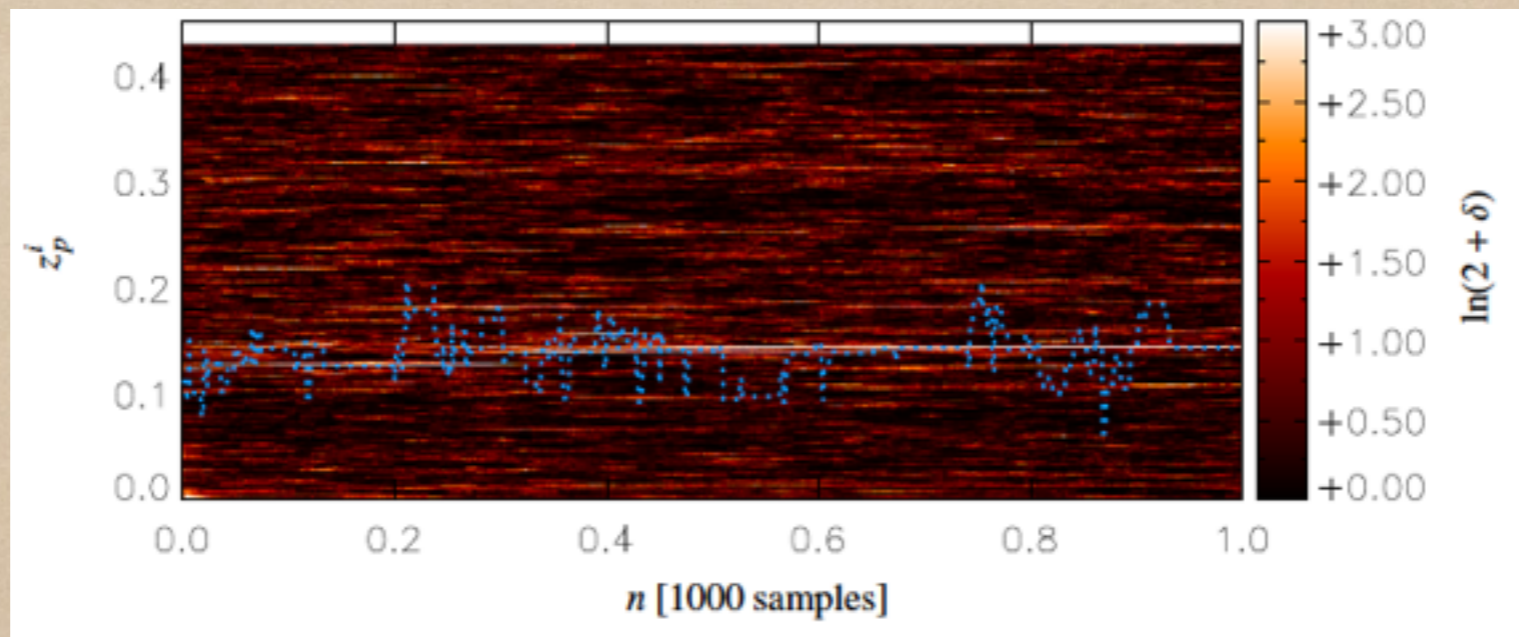
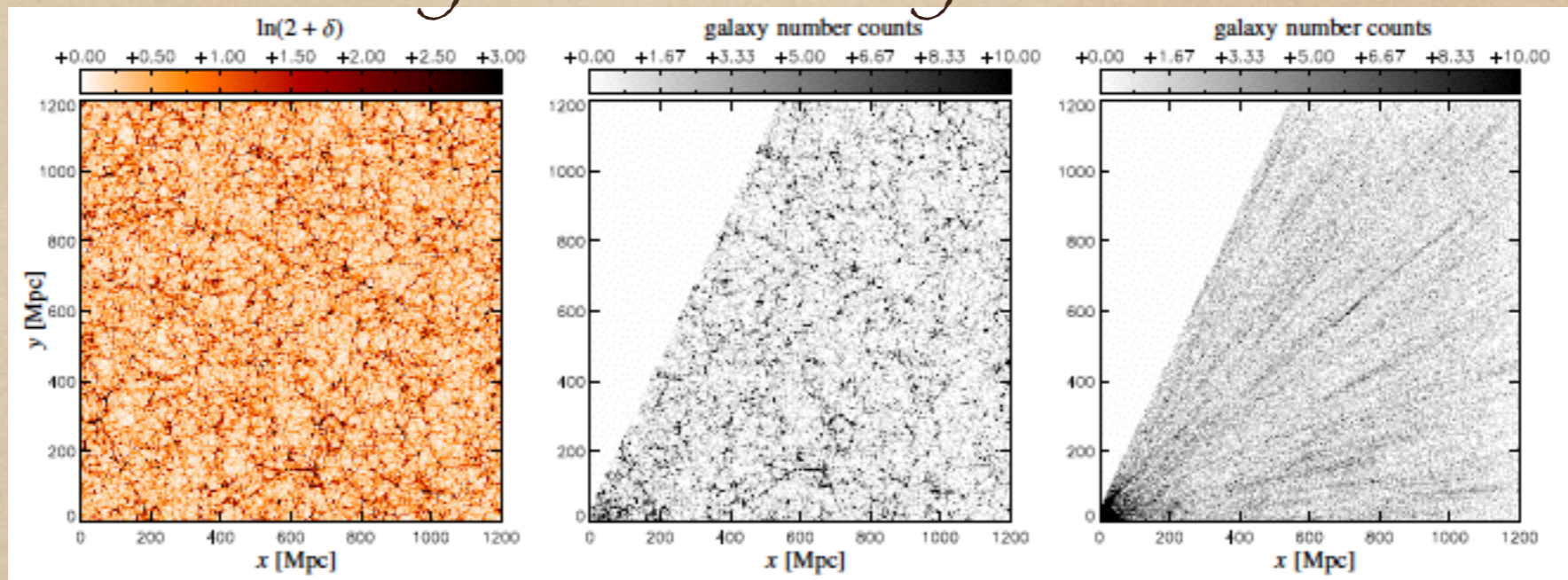
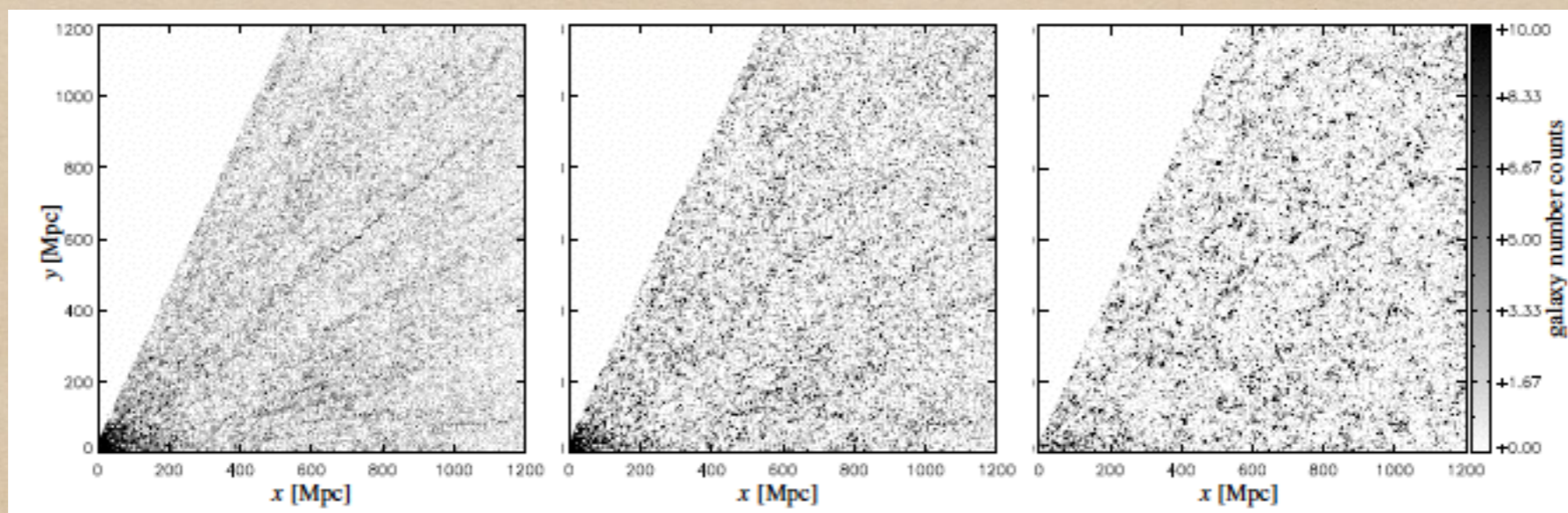


Photo- $z$  & covariance matrix prior  
Jens Jasche  
Benjamin Wandelt (2011)



1

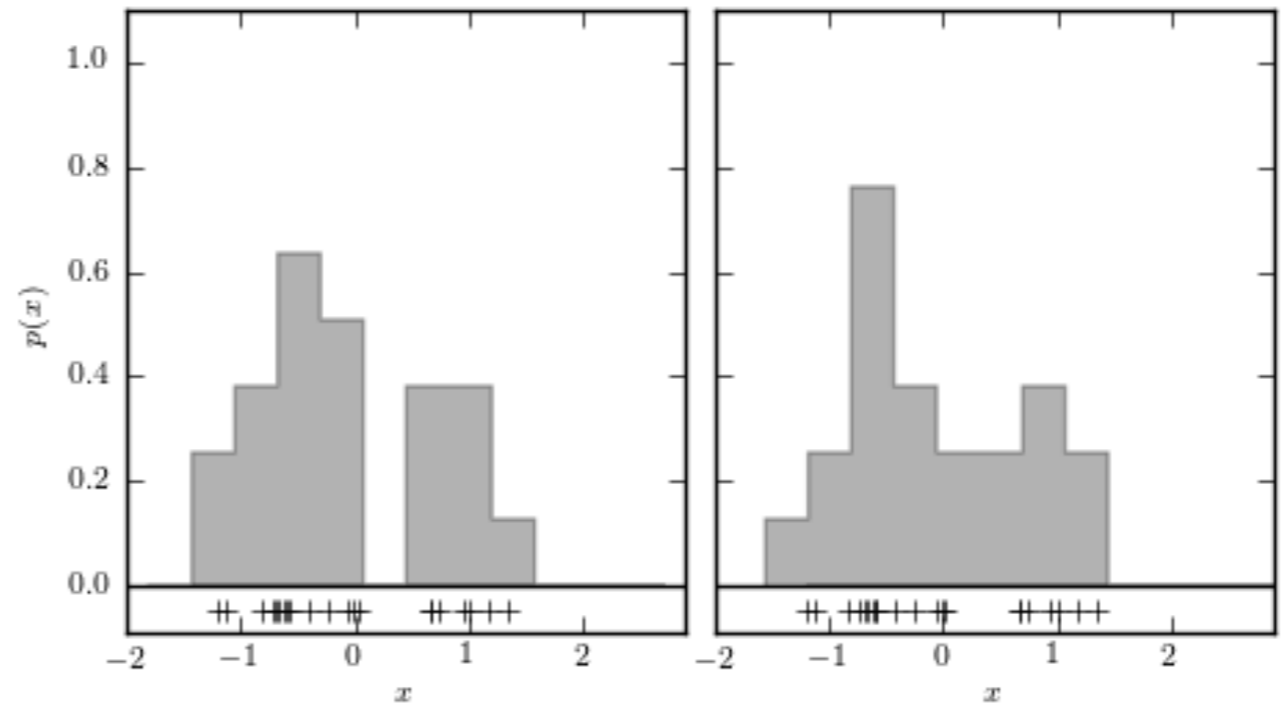
5

100

# Smoothing

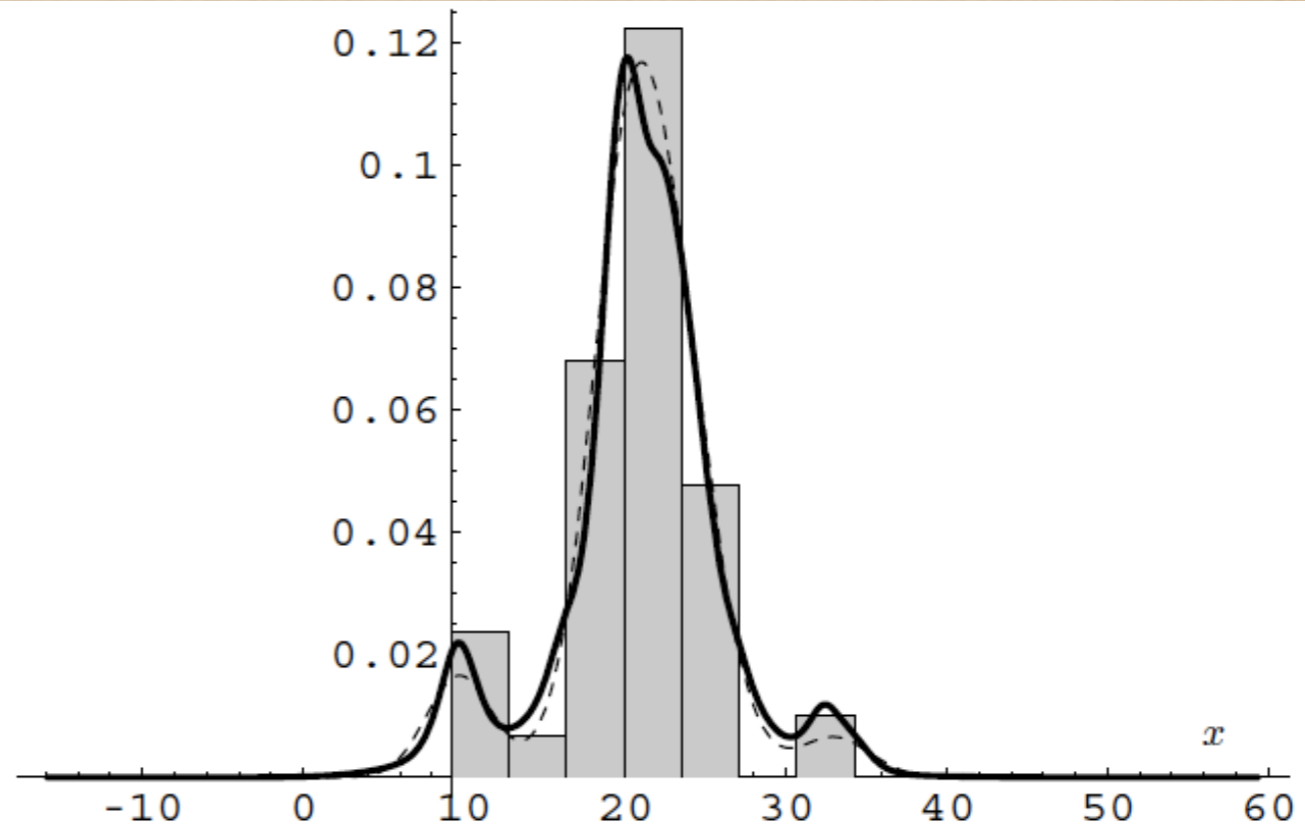
- ◆ Clusters — lensing, X-ray, SZ
- ◆ Filaments — X-ray, SZ, UV, luminosity density
- ◆ Voids — ISW
- ◆ Sheets?

Binning



Kernel smoothing

Error estimates





## Kernel methods

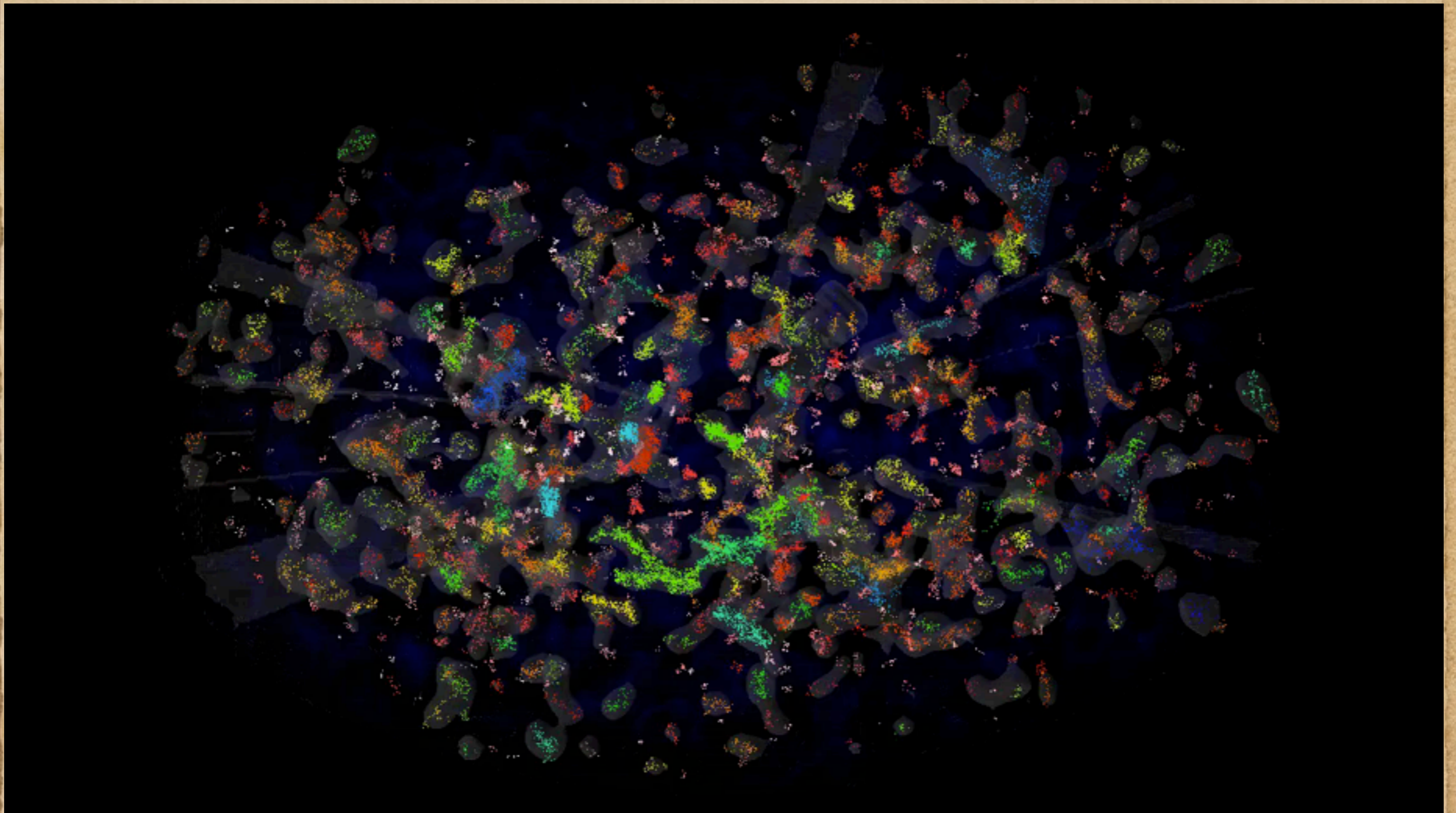
$$\rho(x) = \frac{1}{a} \sum_i K\left(\frac{x - x_i}{a}\right)$$

$$K(x) > 0, \int K(x)dx = 1, \int xK(x)dx = 0, \int x^2 K(x)dx < \infty$$

Error estimates:

crossvalidation

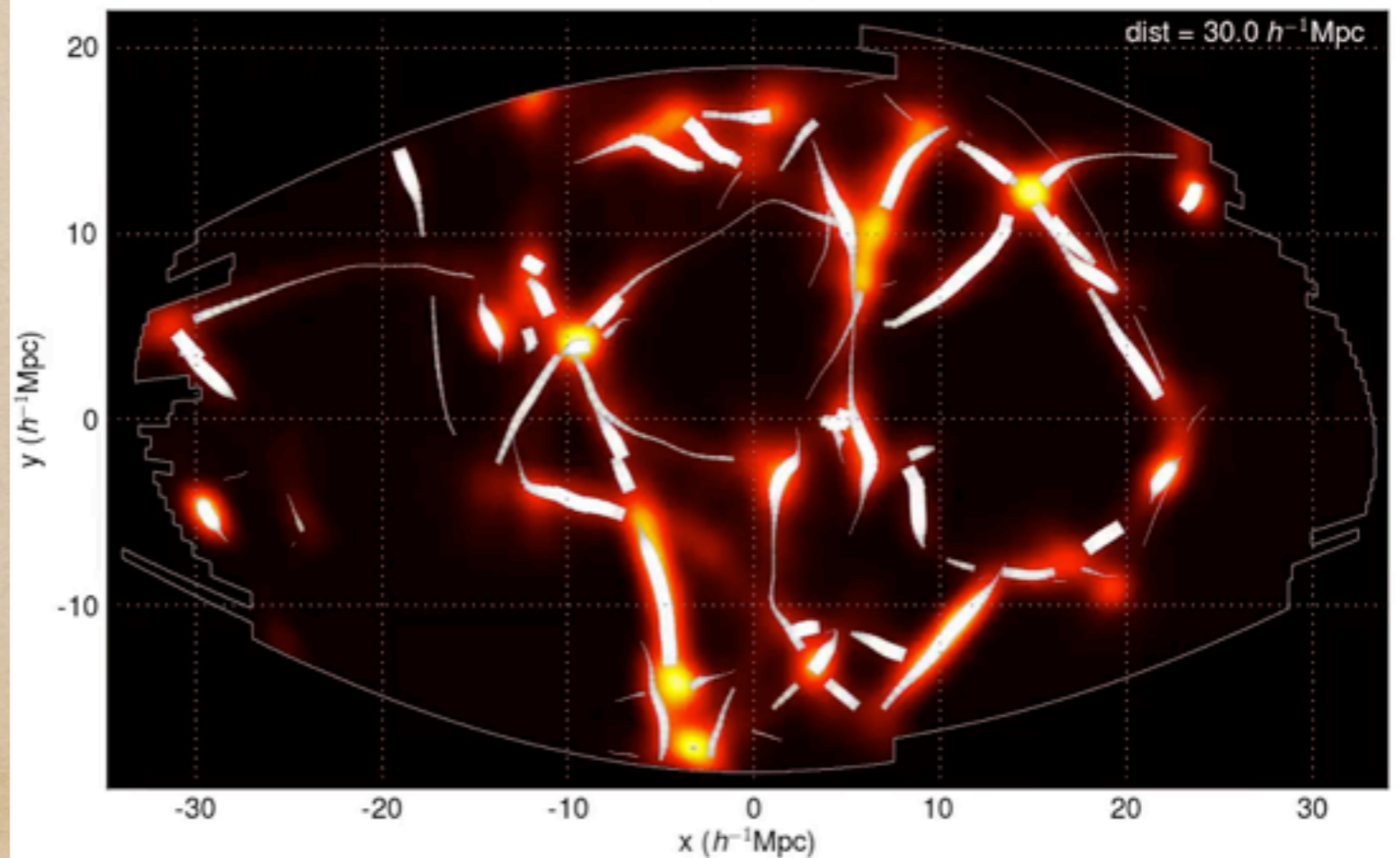
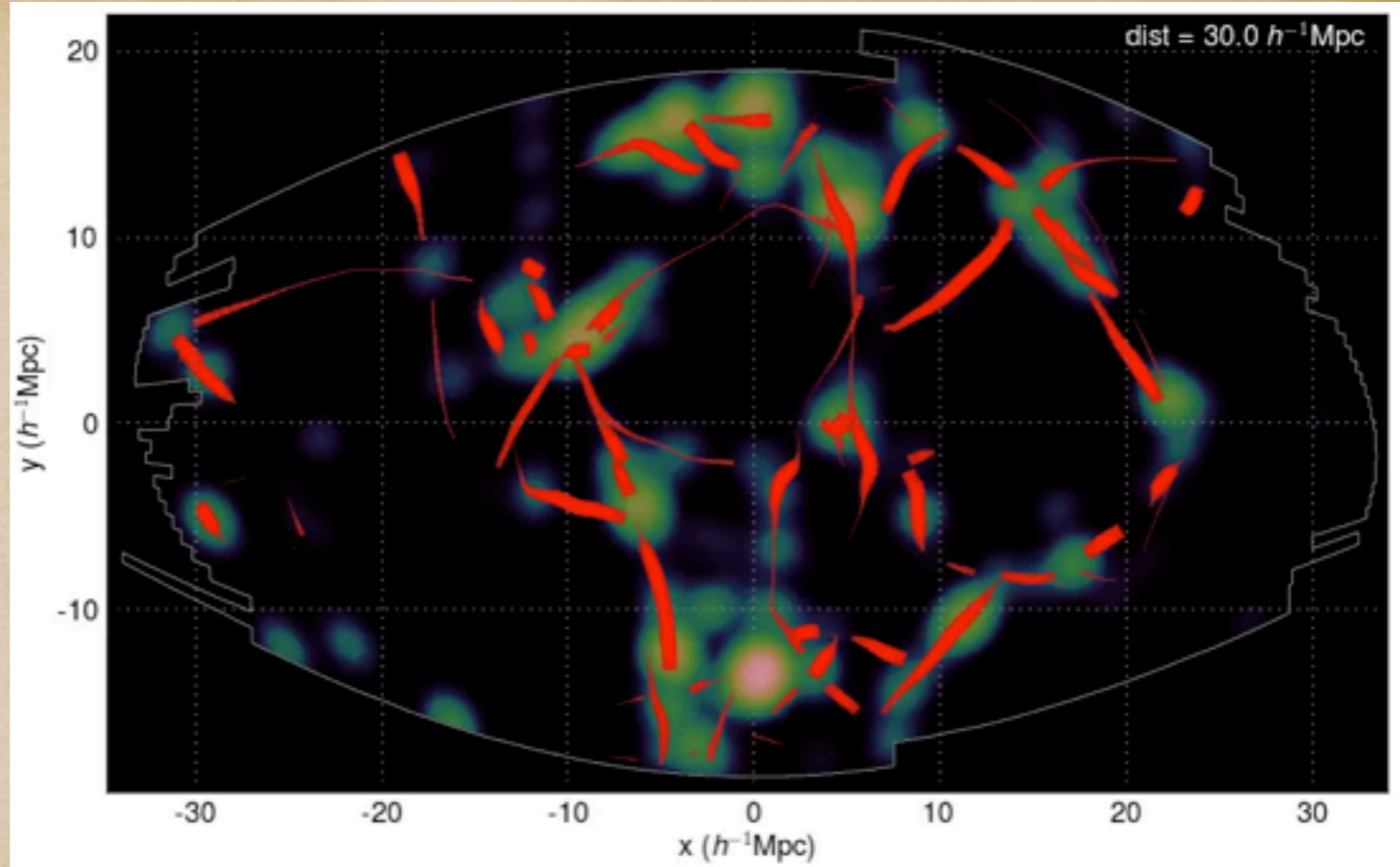
smoothed bootstrap



SDSS superclusters

Juhan Liivamägi

# Filamentary densities

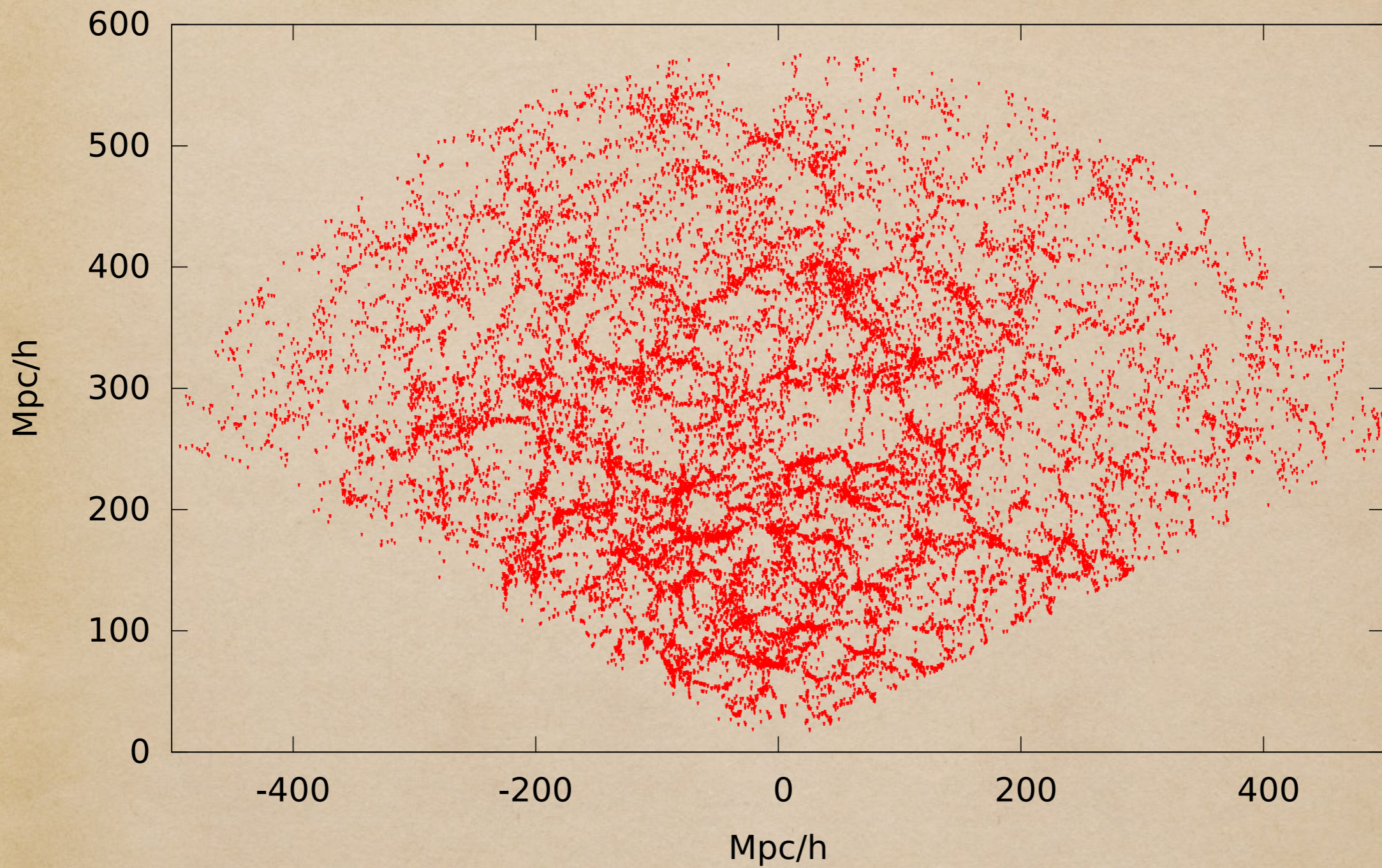


Juhan Liivamägi

# Adaptive estimation

$$\rho(x_k) = \sum_{i \in \text{galaxies}} \frac{1}{a_i} K \left( \frac{x_k - x_i}{a_i} \right) \quad \text{sandbox}$$

$$\rho(x_k) = \sum_{i \in \text{galaxies}} \frac{1}{a_k} K \left( \frac{x_k - x_i}{a_k} \right) \quad \text{balloon}$$



Sloan survey slice

## Anisotropic adaptive kernels

$$\rho(x) = \frac{1}{(2\pi|\Sigma|)^{D/2}} \sum_i \exp\left[-\frac{1}{2}(x - x_i)^T \Sigma^{-1}(x - x_i)\right]$$

$$\Sigma_i = \sum_{j \text{ (over galaxies)}} w(x_i, x_j, R)(x_j - x_i)(x_j - x_i)^T$$

$$w(x_i, x_j, R) = \frac{1}{\sqrt{2\pi}R} \exp\left[-\frac{1}{2R^2}(x_i - x_j)^2\right]$$

# Output

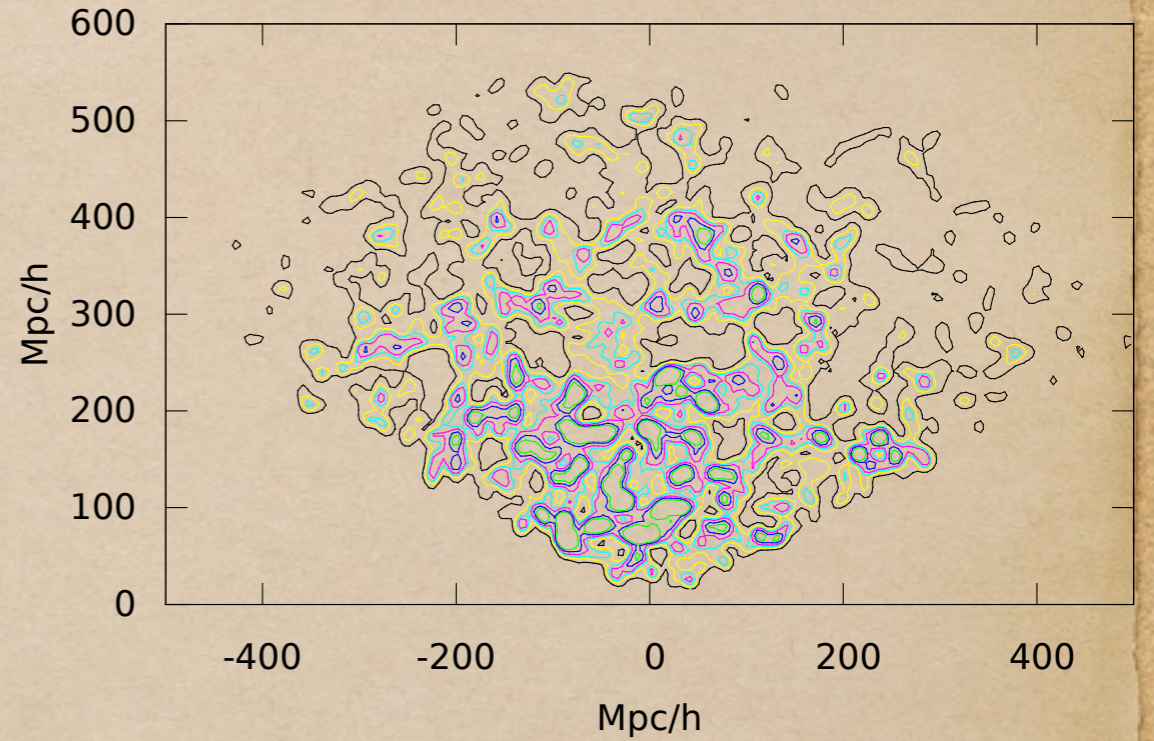
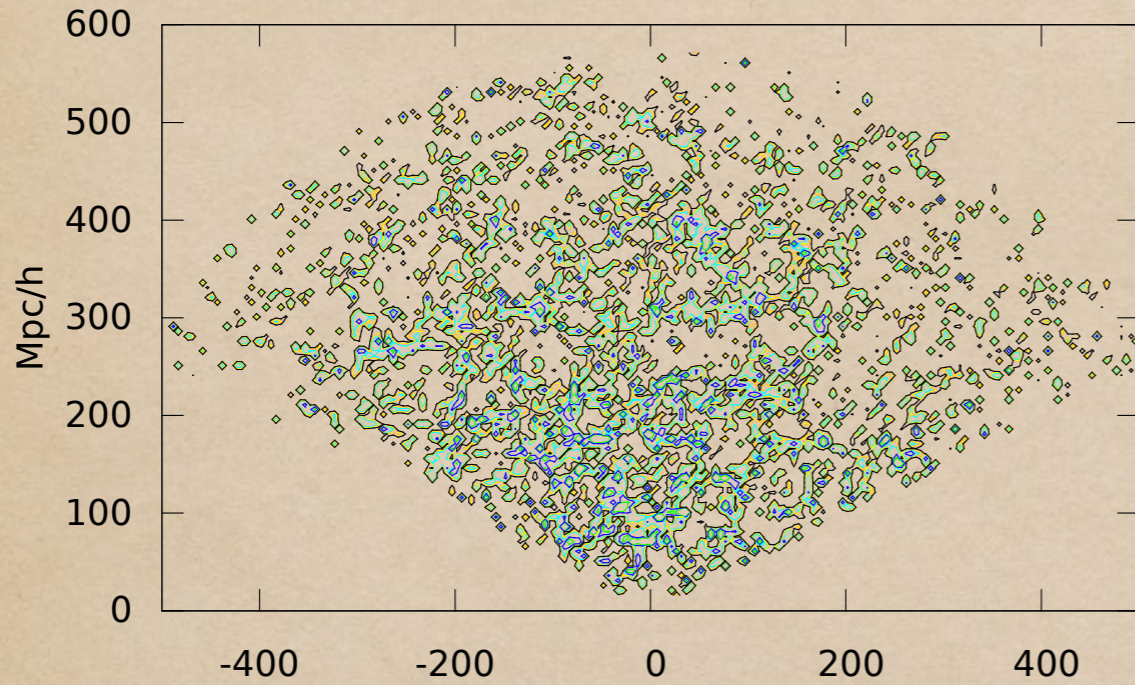
- ◆ adaptive density
- ◆ three eigenvectors (two independent)
- ◆ three scale factors (eigenvalues)
- ◆ two ellipticities (filament & sheet indices)

# 2-D Densities

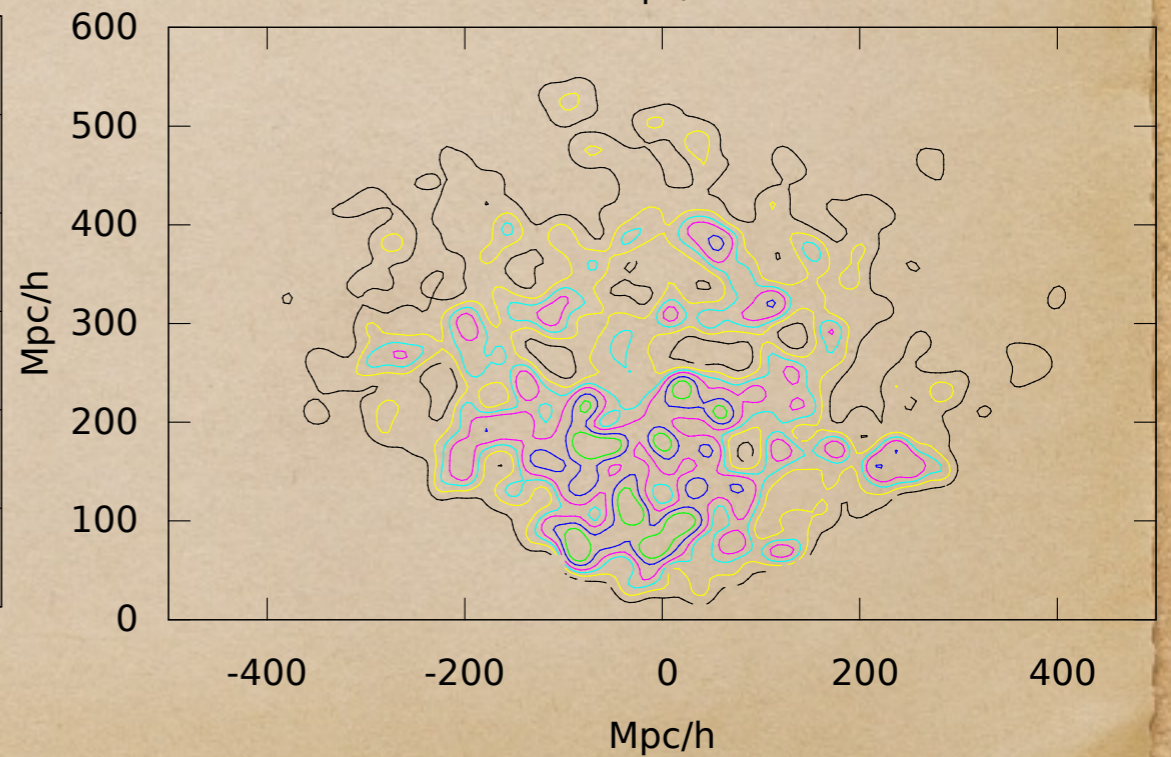
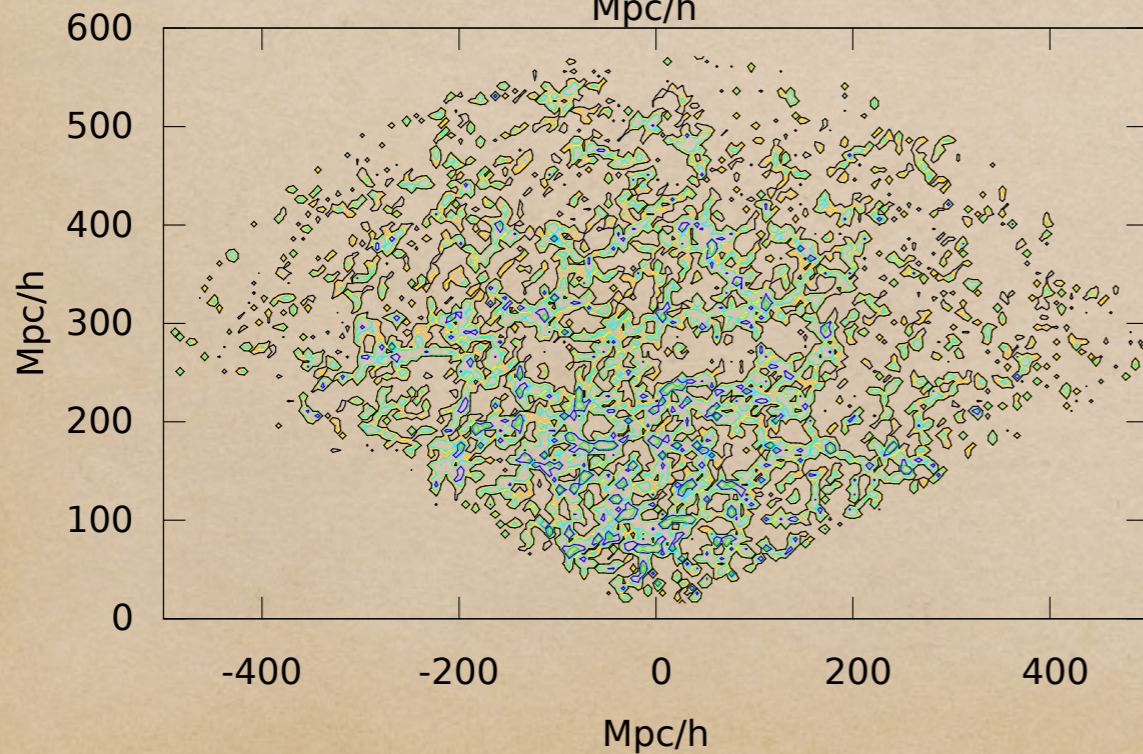
## Adaptive

## Gaussian

5



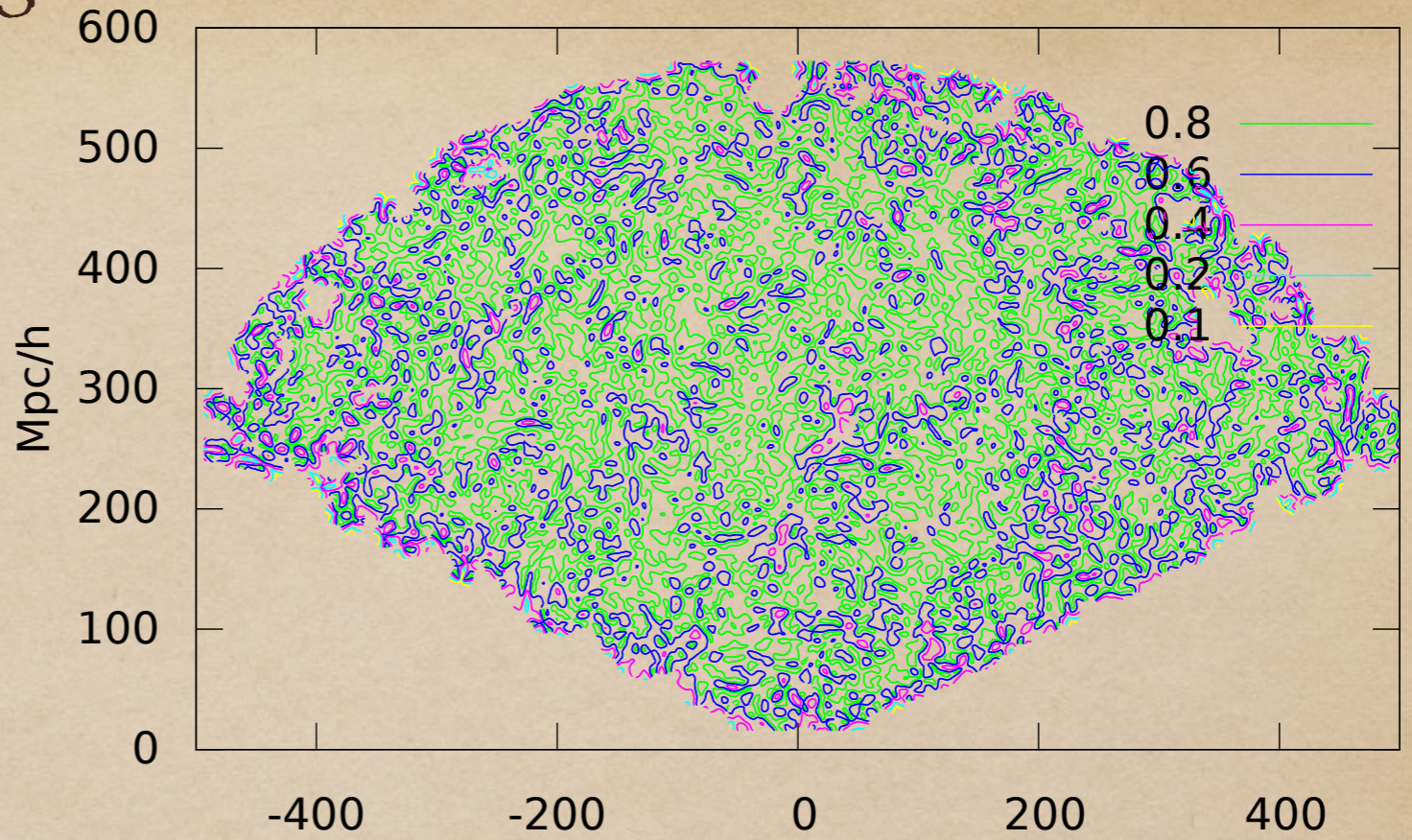
10



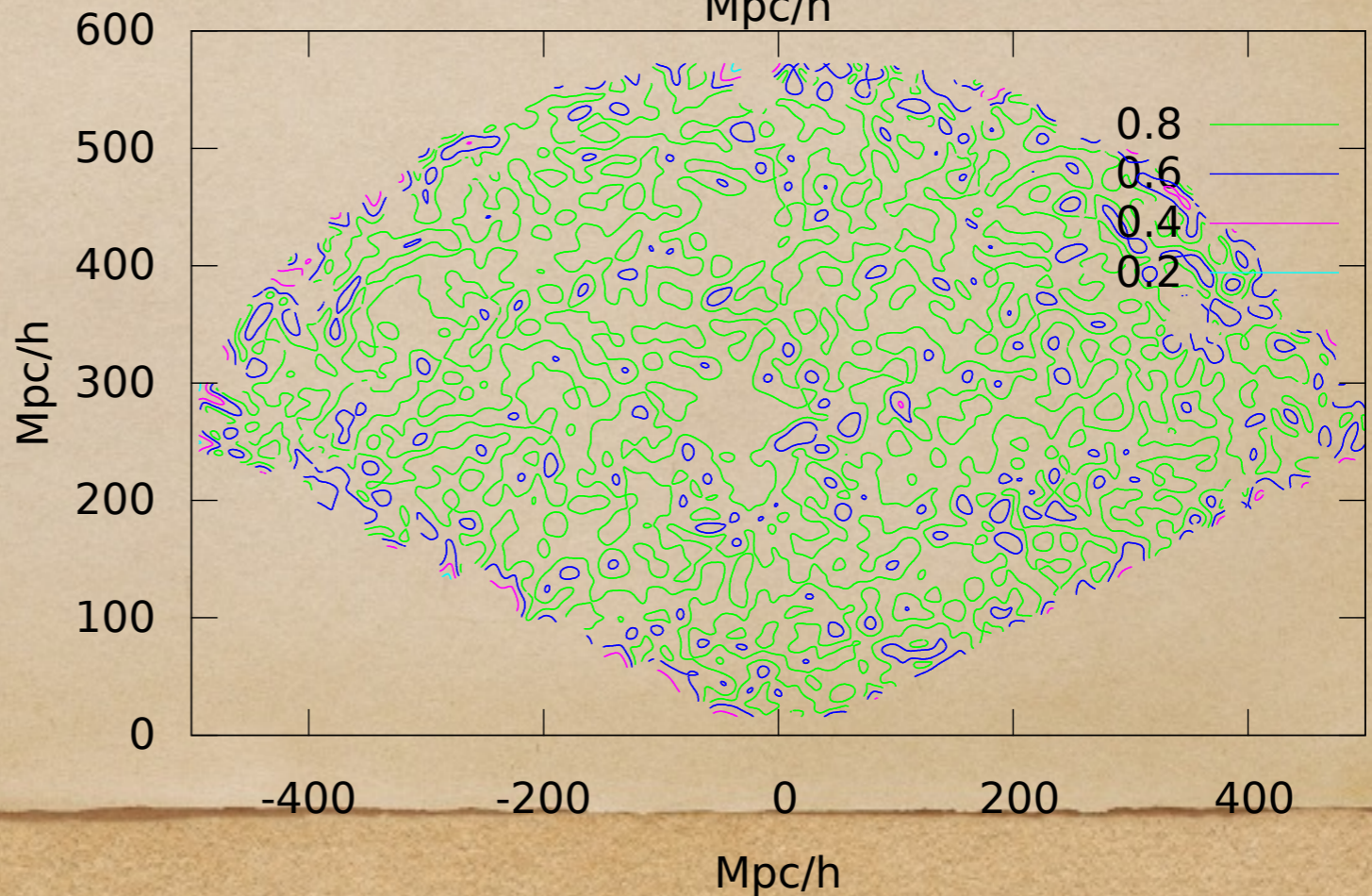


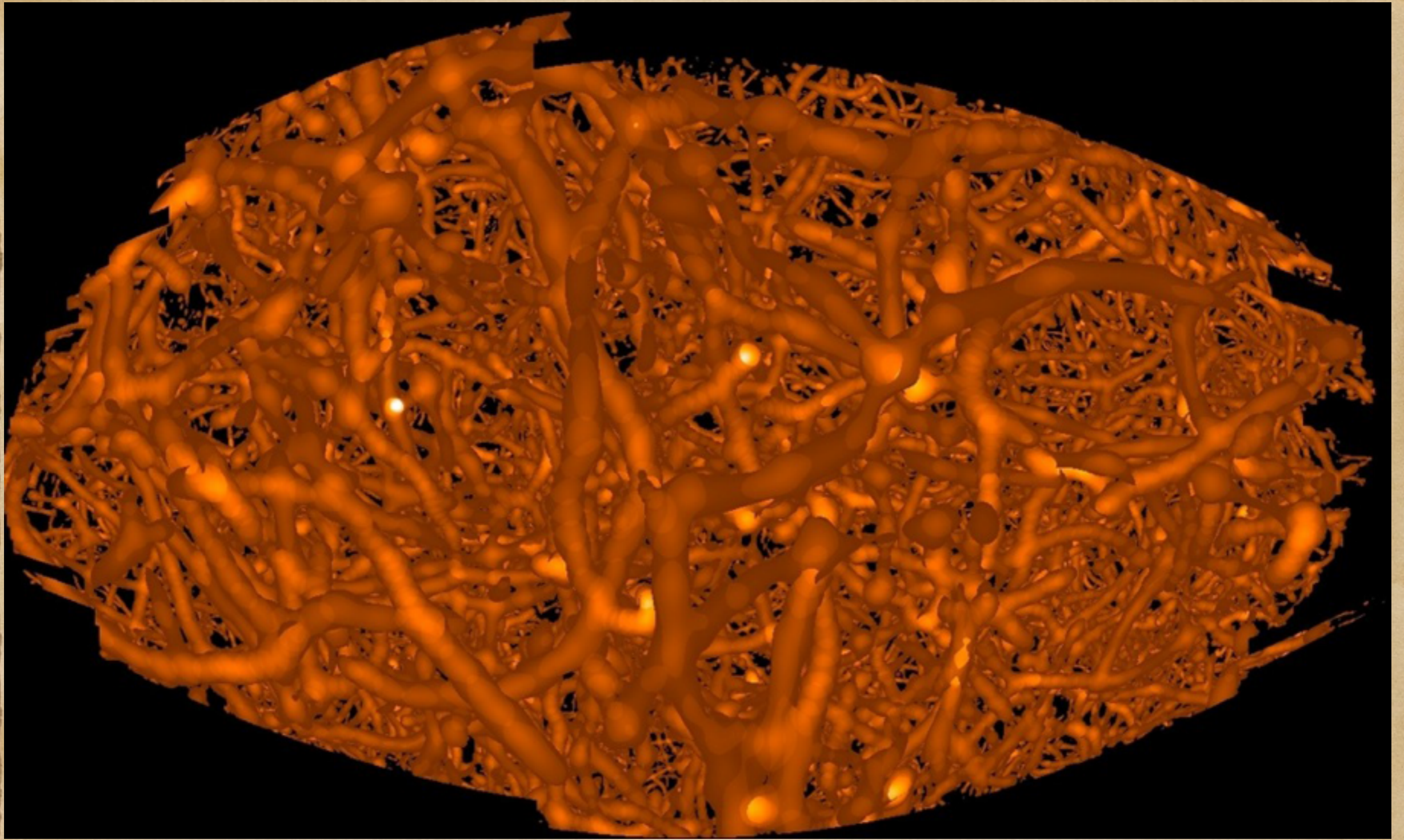
# Axis ratios

$R=5$



$R=10$





Filament sky

by Juhan Liivamägi