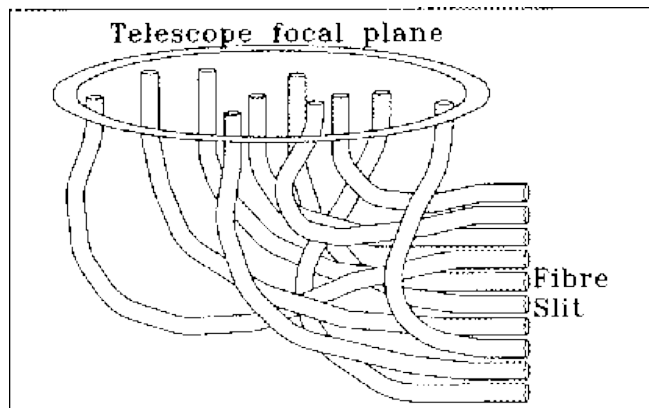
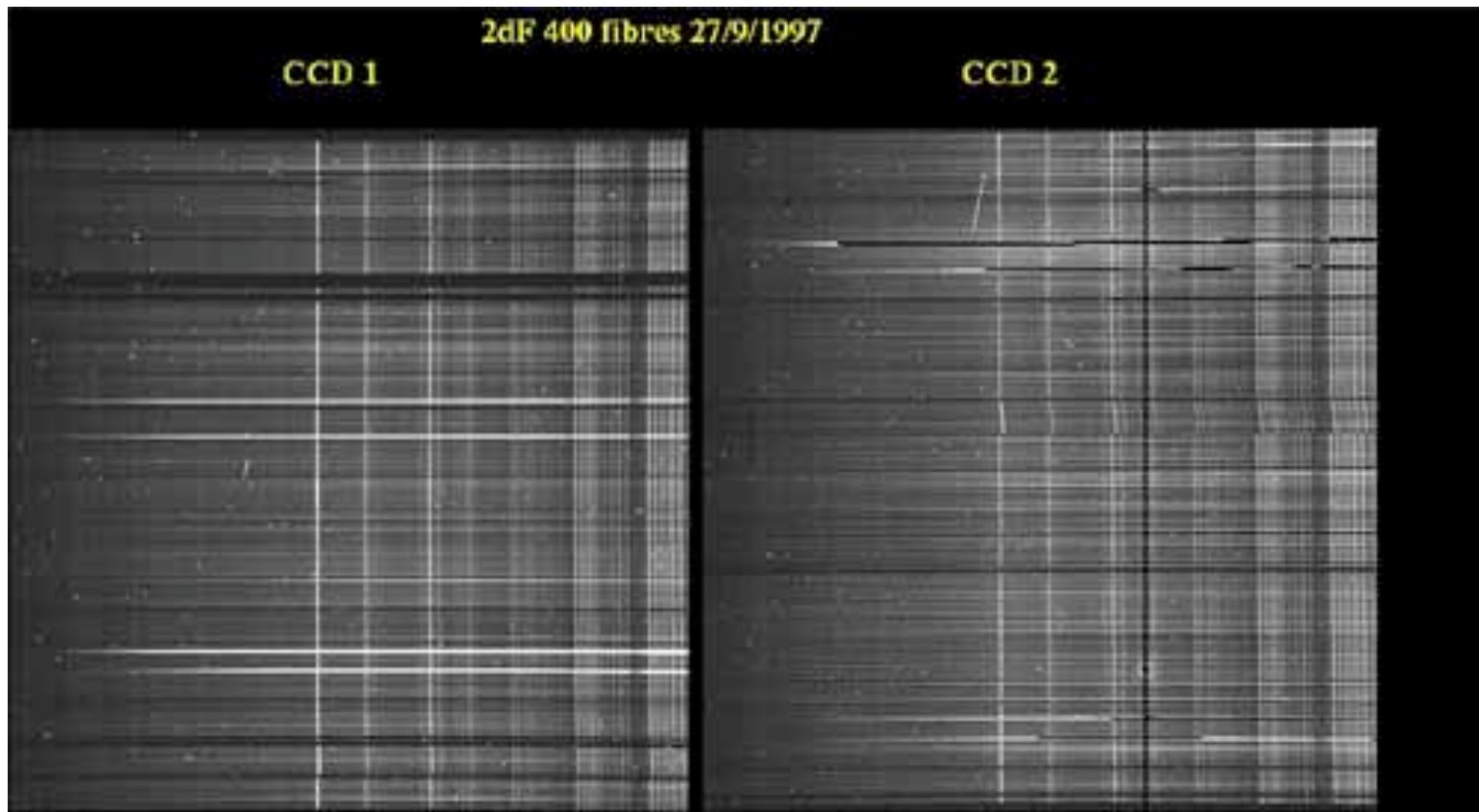


# Multi-object spectroscopy



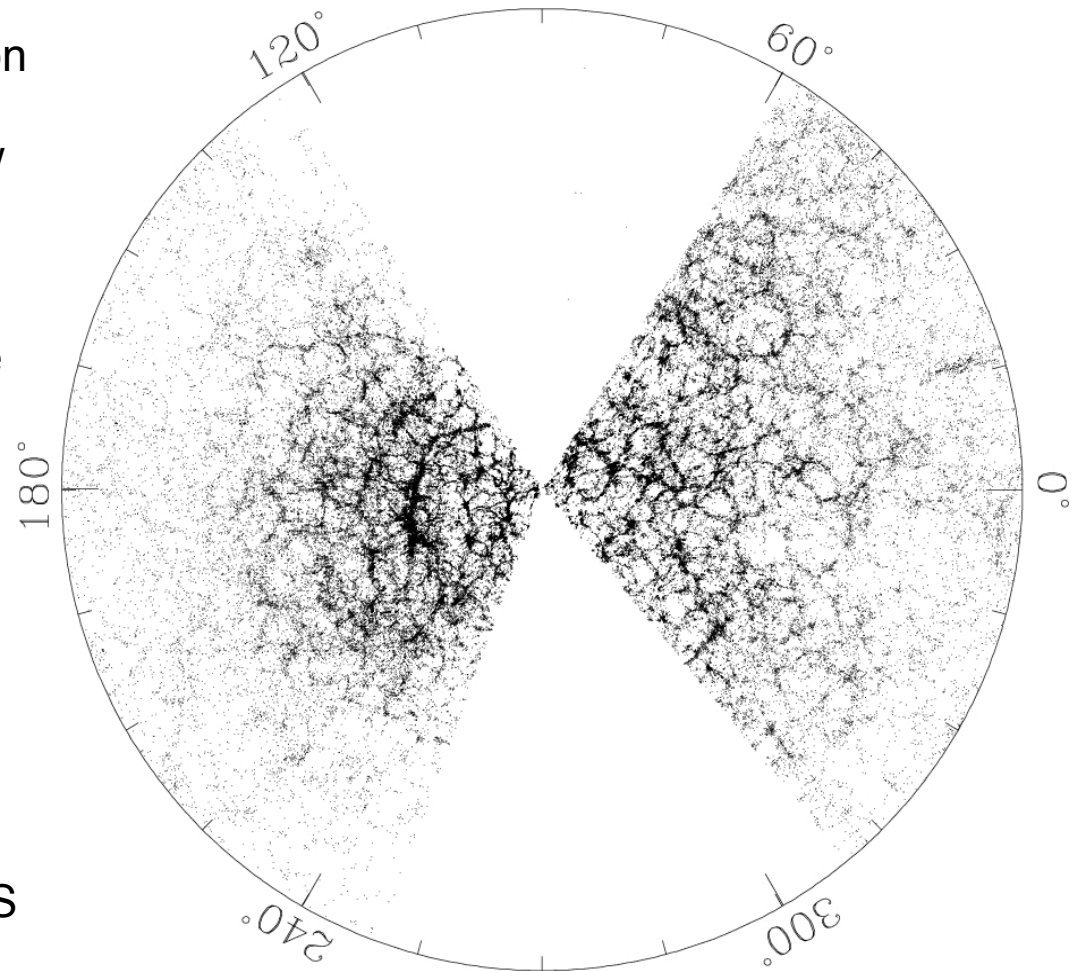
- Single-slit spectroscopy does not make full use of the imaging capability of a telescope: several objects are imaged but only one is used
- Multi-slit and Fibre-fed spectrographs solve this problem.
- In the latter case, a set of optical fibers are positioned in the focal plane of the telescope so that each is illuminated by a target object. The fibers are then connected to a series of position in the spectrograph

# Multi-object spectra



# Massive redshift surveys

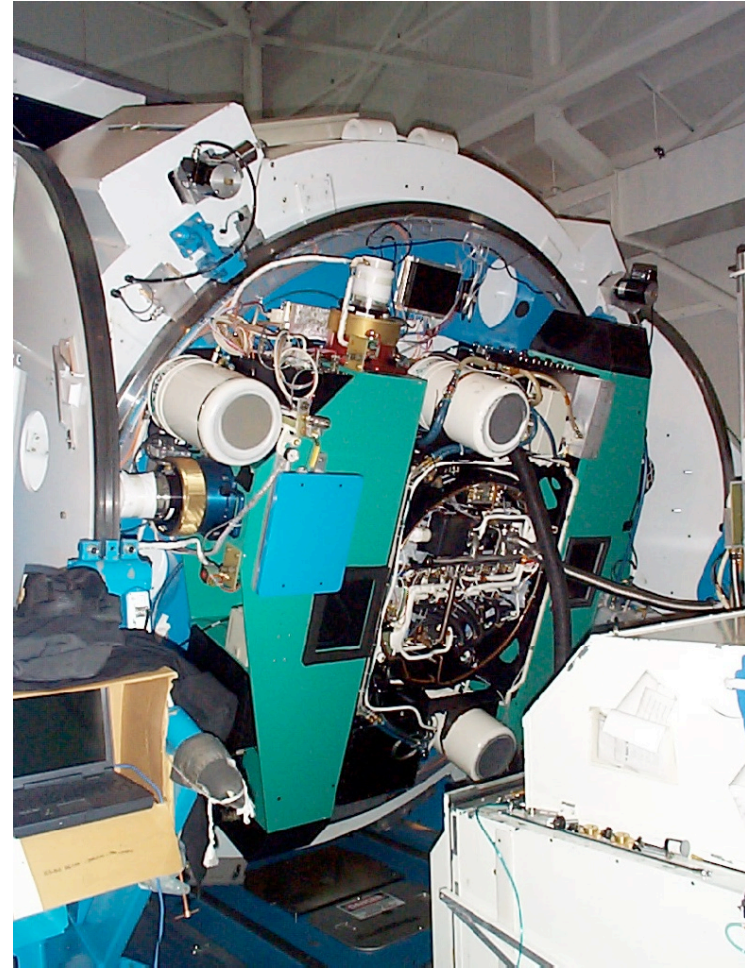
- Multifibre technology, digitalization and multiobject spectrographs now allow us to measure redshift of millions of galaxies on a time scale of a few years.
- Recently completed or ongoing surveys: (local) 2dF, SDSS, 6dF (high-z) VVDS, DEEP2, zCOSMOS



# The Sloan Digital Sky Survey

- Over eight years of operation (SDSS I, 2000–2005; SDSS II, 2005–2008; SDSS III, 2008–2014)
- It used a dedicated 2.5m telescope at Apache Point Observatory (New Mexico) equipped with 2 special purpose instruments: a 120 Mpixel camera imaging 1.5 sq. deg. of the sky at a time (8 times the area of the full moon); a pair of spectrographs fed by optical fibers (640 objects per pointing)
- It obtained deep multi-color images (u,g,r,i,z) covering more than a quarter of the sky (8,400 square degrees)
- Created 3D maps containing more than 930,000 galaxies and more than 120,000 quasars (in 5,700 square degrees)

# The SDSS telescope and instruments



# Groundbreaking technology



Photo: U. Montan

**Charles Kuen Kao**



Photo: U. Montan

**Willard S. Boyle**

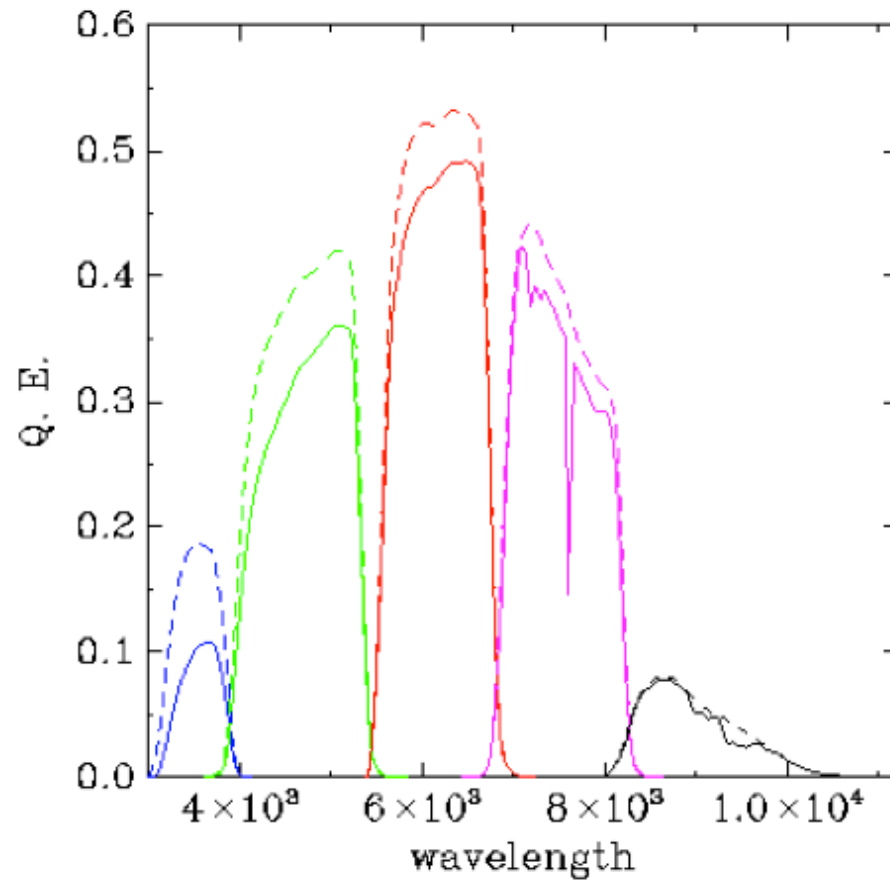


Photo: U. Montan

**George E. Smith**

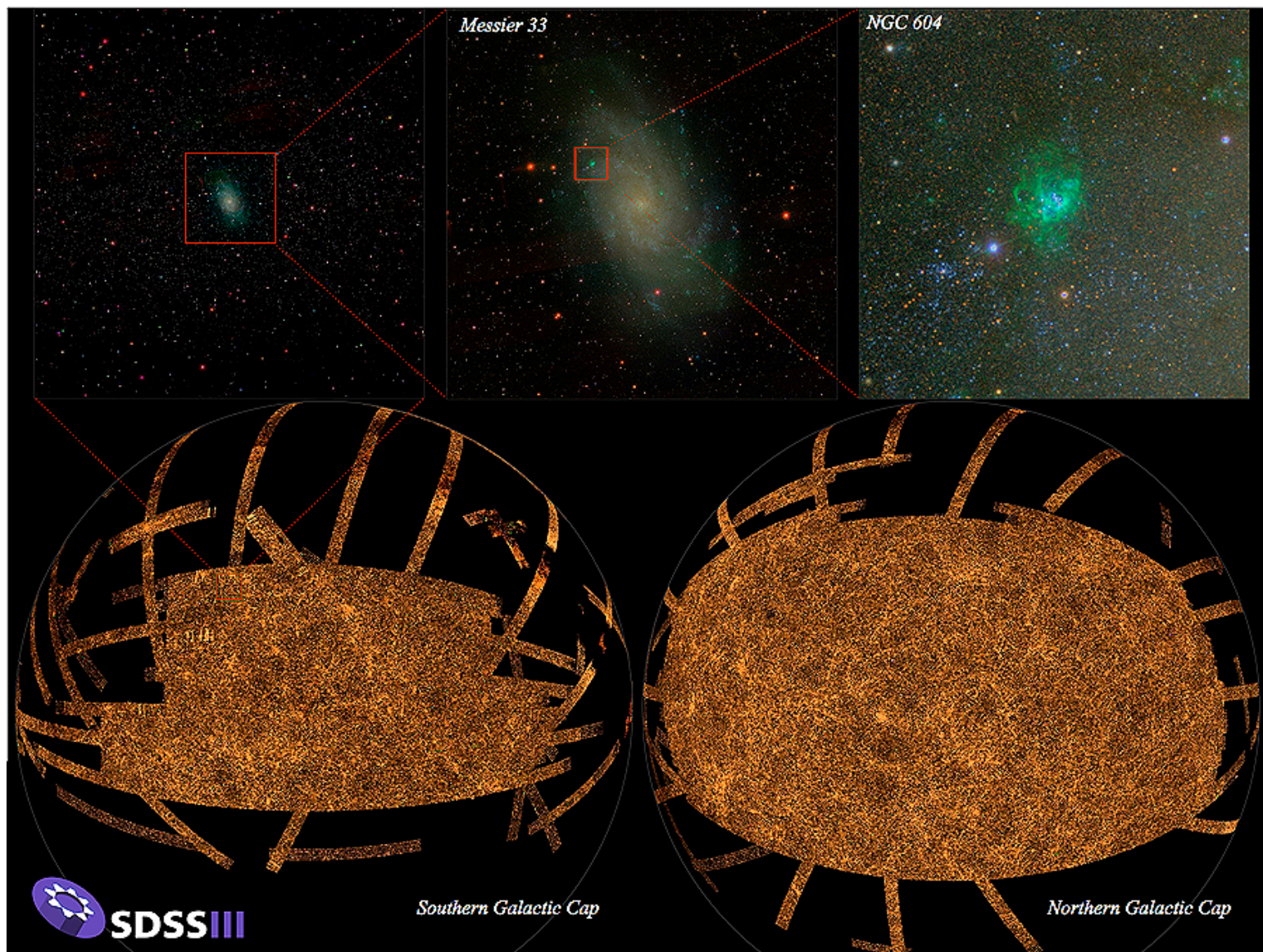
The Nobel Prize in Physics 2009 was divided, one half awarded to Charles Kuen Kao *"for groundbreaking achievements concerning the transmission of light in fibers for optical communication"*, the other half jointly to Willard S. Boyle and George E. Smith *"for the invention of an imaging semiconductor circuit – the CCD sensor"*.

# SDSS filter transmission curves



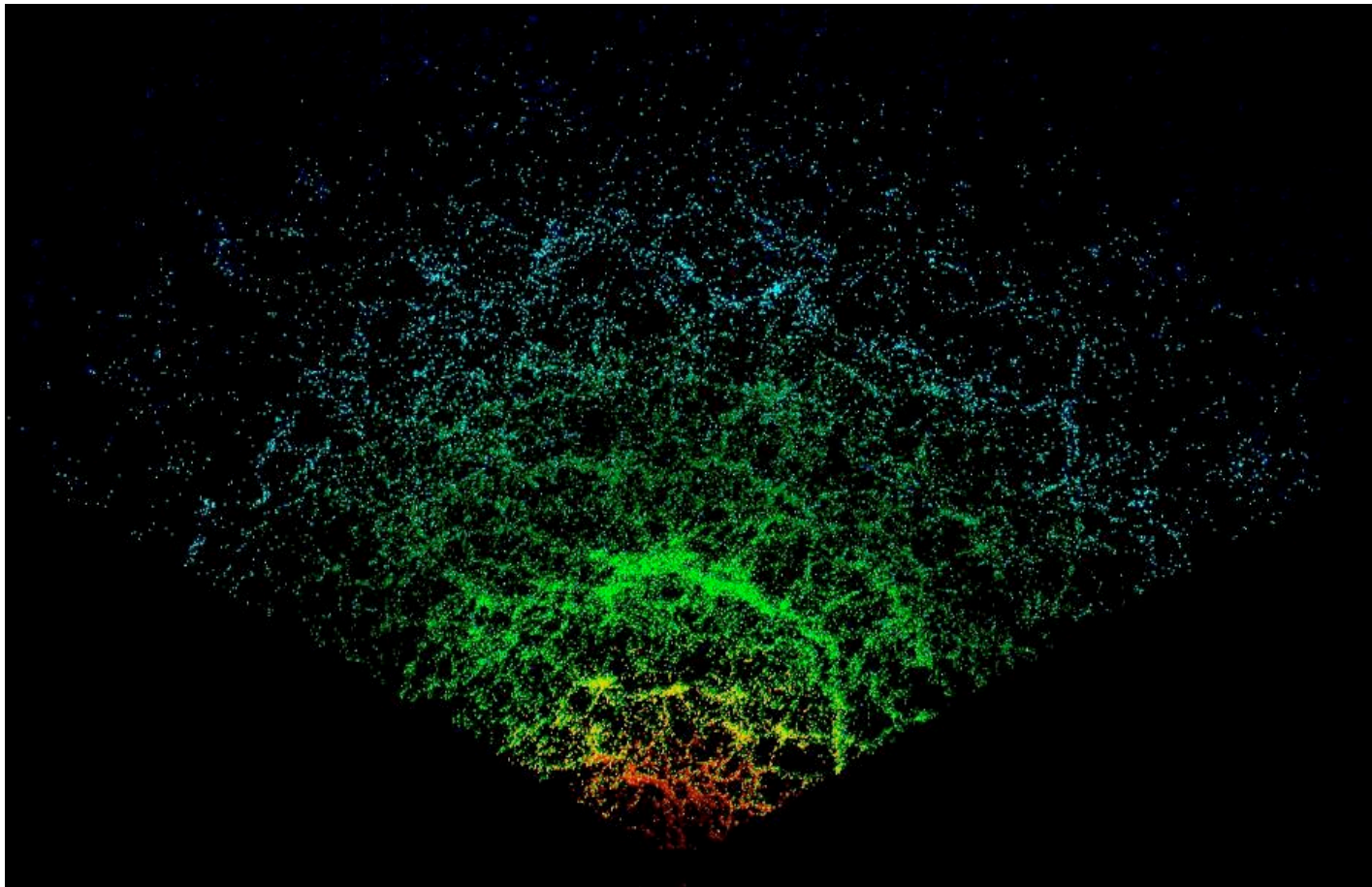
Filter Average  
wavelength

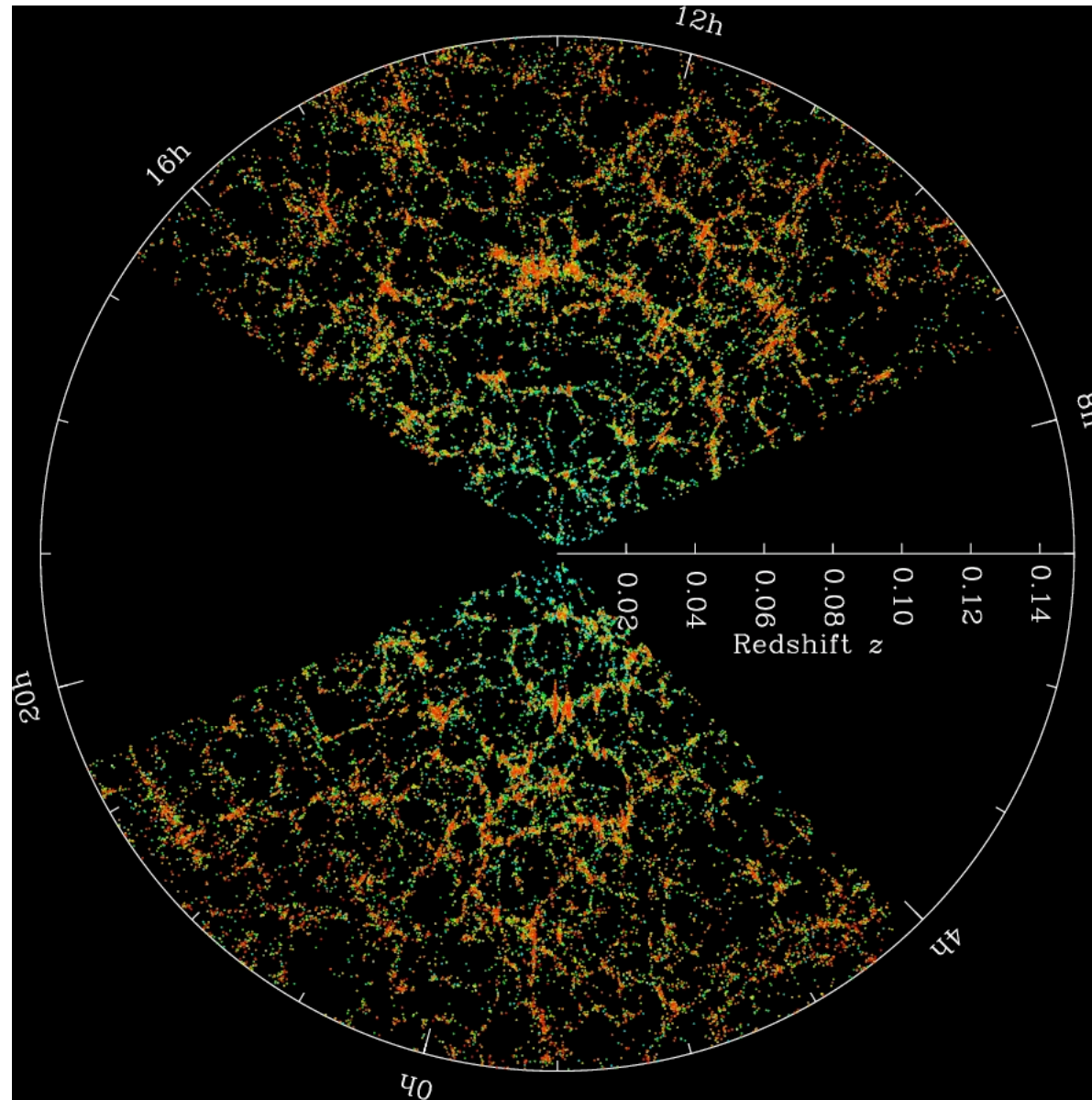
u	3551 Å
v	4686 Å
r	6165 Å
i	7481 Å
z	8931 Å





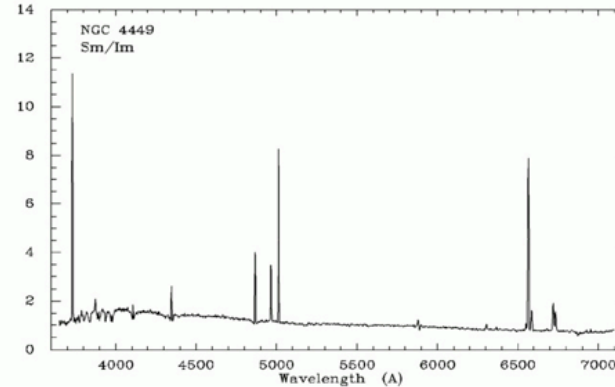
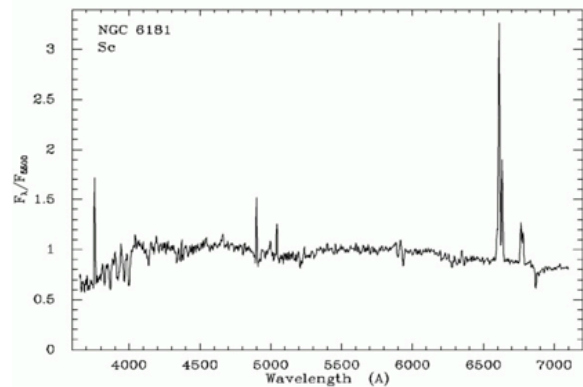
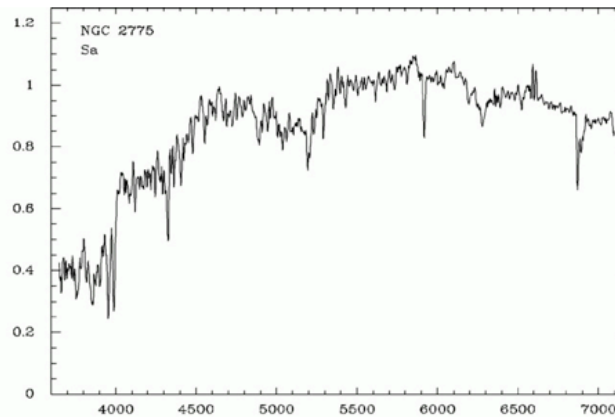
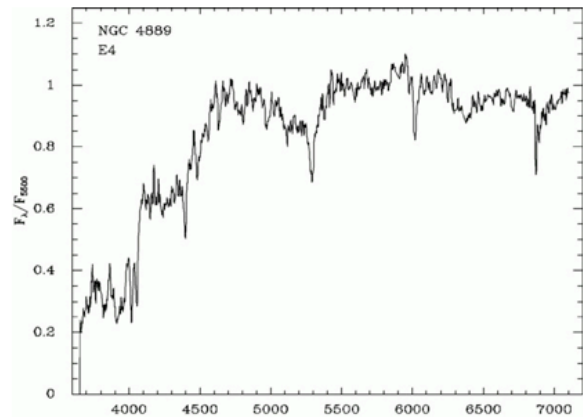
# The Sloan Digital Sky Survey





# Photometric redshifts

# Galaxy spectra

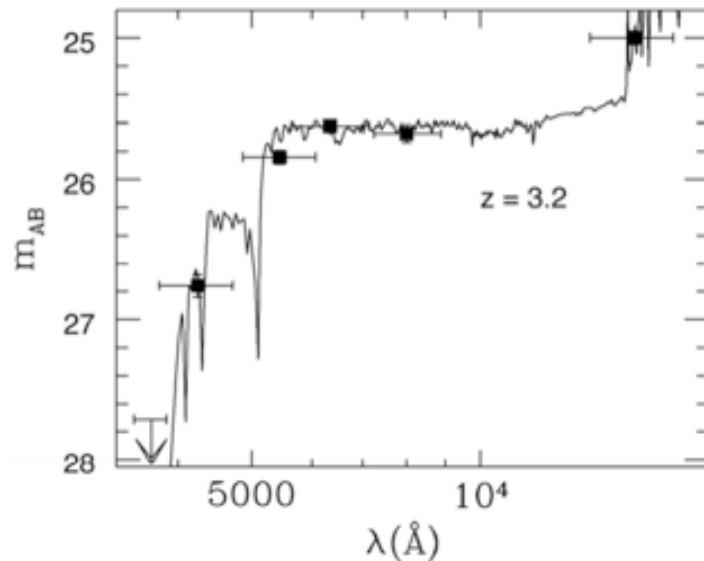


Galaxies show a variety of optical spectra which can be classified based on:

- strength of blue continuum
- composite stellar absorption features
- strength of nebular emission lines

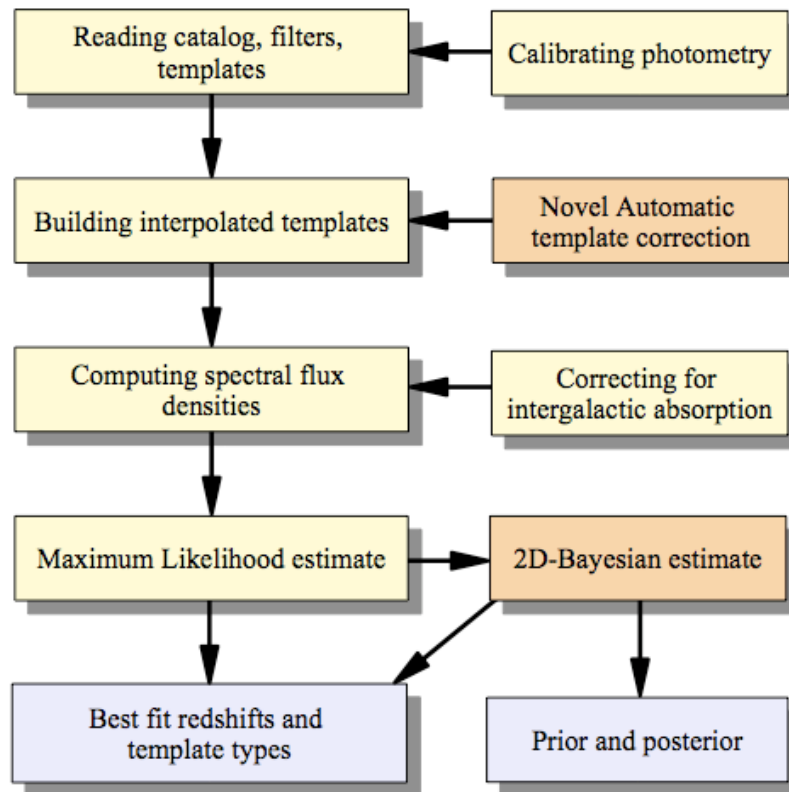
Templates of the different classes can be easily built

# Photometric redshifts

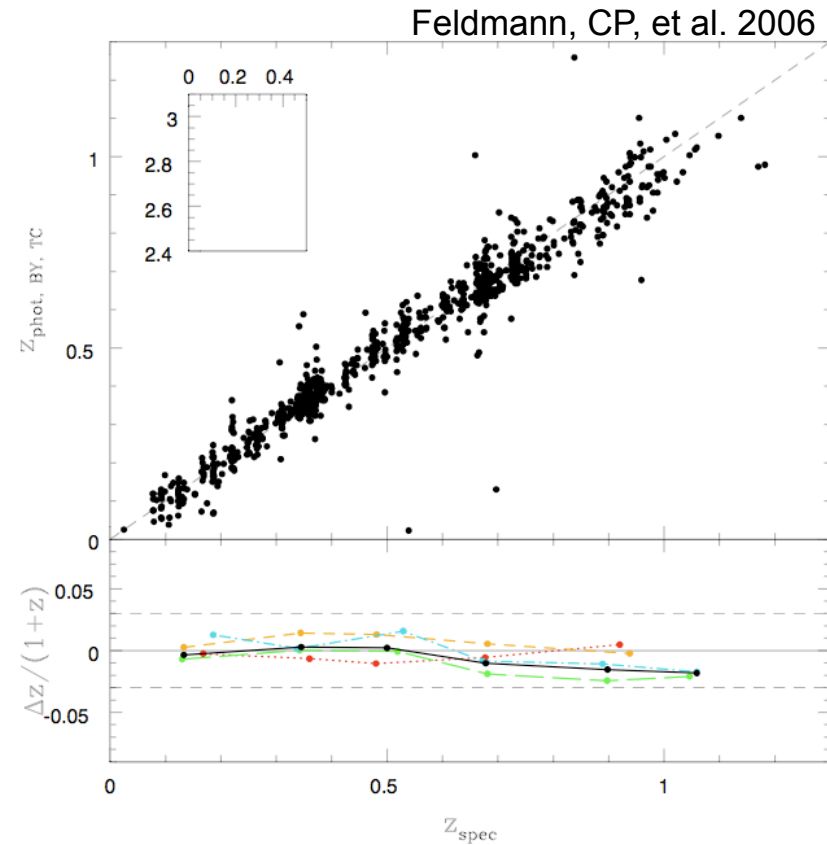


- Cheap estimate (in terms of observational time) of galaxy redshifts using multi-color, broadband photometry instead of spectroscopy
- It simply chooses the best-fitting redshifted spectrum out of a library of templates (either observationally or theoretically motivated)
- Rather than observing narrow spectral features of galaxy spectra (such as emission lines) this technique concentrate on broad features (such as spectral breaks) and the overall shape of a spectrum

# Photometric redshifts



C. Porciani



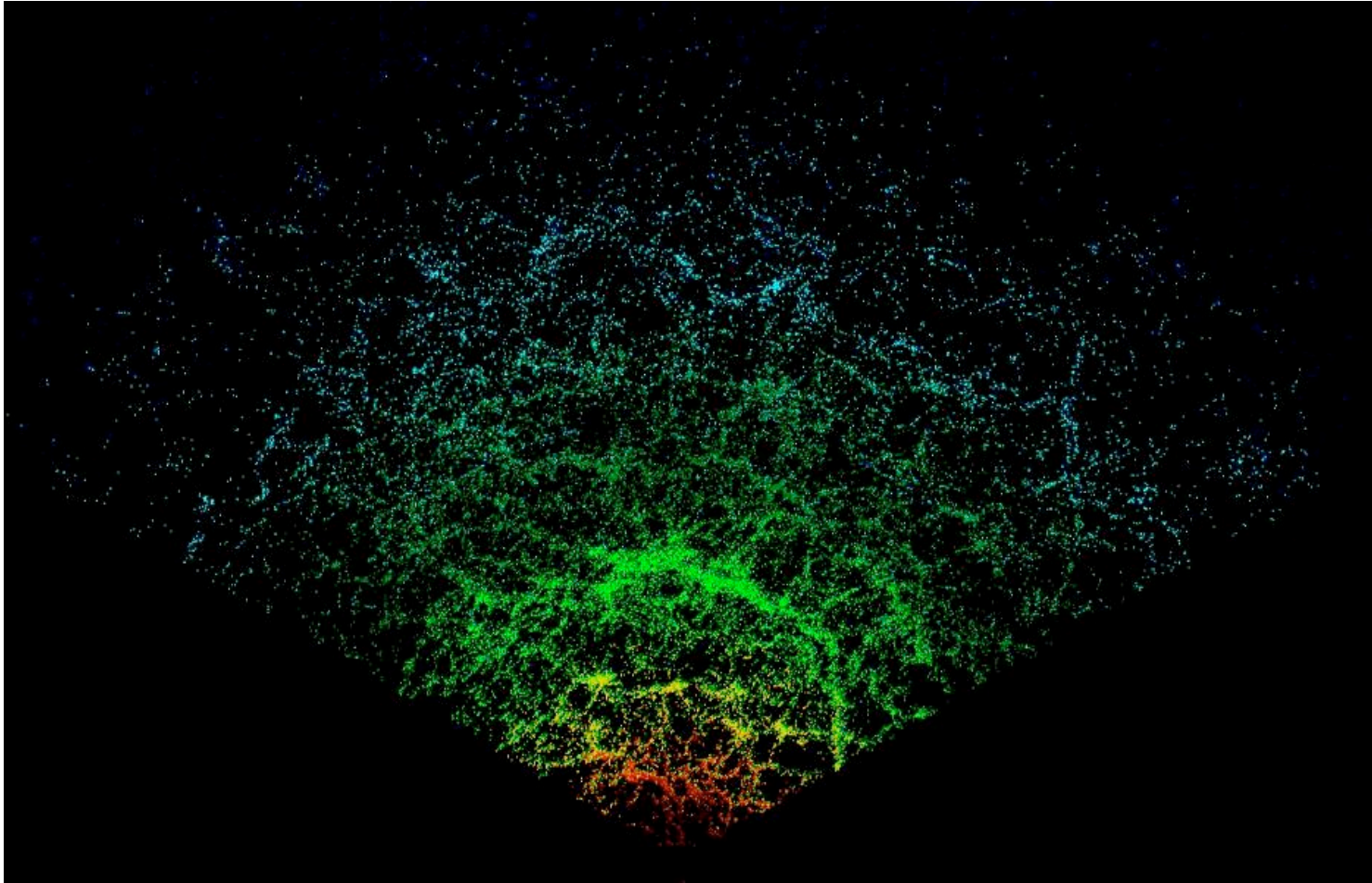
Observational Cosmology

III-35

# Characteristics of a galaxy survey

- Photometric (how many bands?) vs spectroscopic (What's the redshift completeness? What's the success rate?)
- All redshift surveys start from an parent (input) catalog. How are targets selected? Magnitude limited (in what band?) vs volume limited vs (pre) color selected
- How many square degrees? Down to what redshift? (wide vs deep) What geometry? (pencil beam vs wide angle)
- Before computing any statistic compute (or download) the **selection function** (density of galaxies as a function of redshift) and the **completeness map** (what fraction of objects are included in the survey as a function of position and redshift?). Otherwise you will fail miserably!

# Science with galaxy surveys



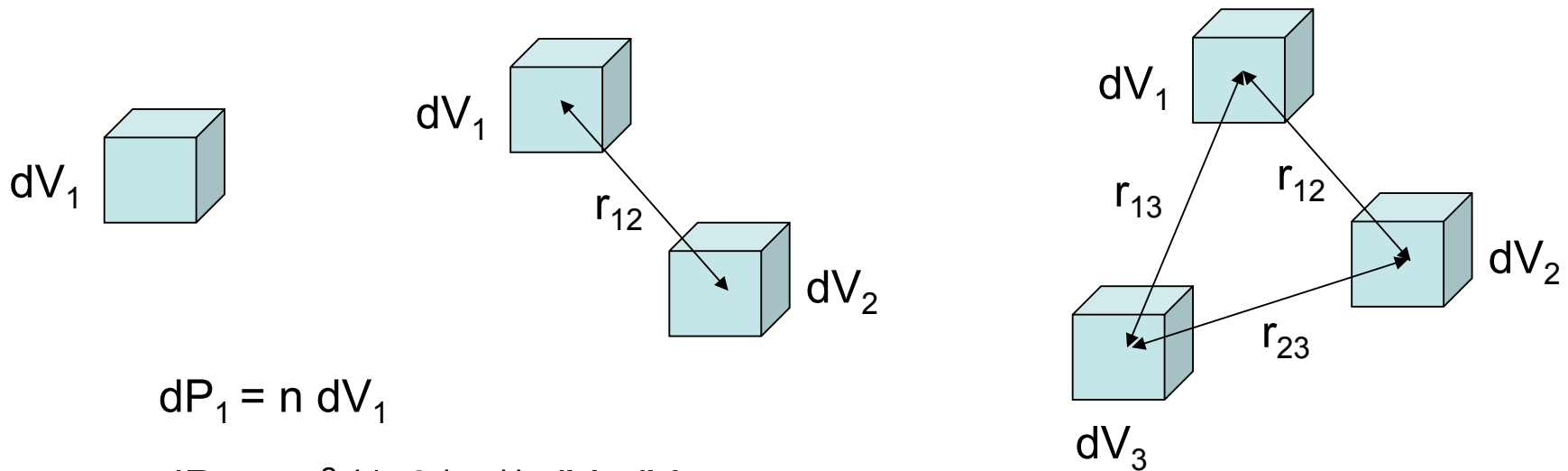


# What can you measure?

- Luminosity function and number densities
- Group and cluster catalogs (FoF, Voronoi, BCG)
- The density field
- Reconstruct the linear density field (time machine)
- Counts in cells
- Measure 2-point, 3-point correlation function
- Measure power spectrum, bispectrum
- Topological invariants: Minkowski functionals (mean genus, void probability function)

# Correlation functions

Consider a stationary point process with mean density  $n$  and write the probability of finding  $N$  points within  $N$  infinitesimal volume elements



$$dP_1 = n dV_1$$

$$dP_{12} = n^2 (1 + \xi(r_{12})) dV_1 dV_2$$

$$dP_{123} = n^3 (1 + \xi(r_{12}) + \xi(r_{13}) + \xi(r_{23}) + \zeta(r_{12}, r_{13}, r_{23})) dV_1 dV_2 dV_3$$

# Power spectra

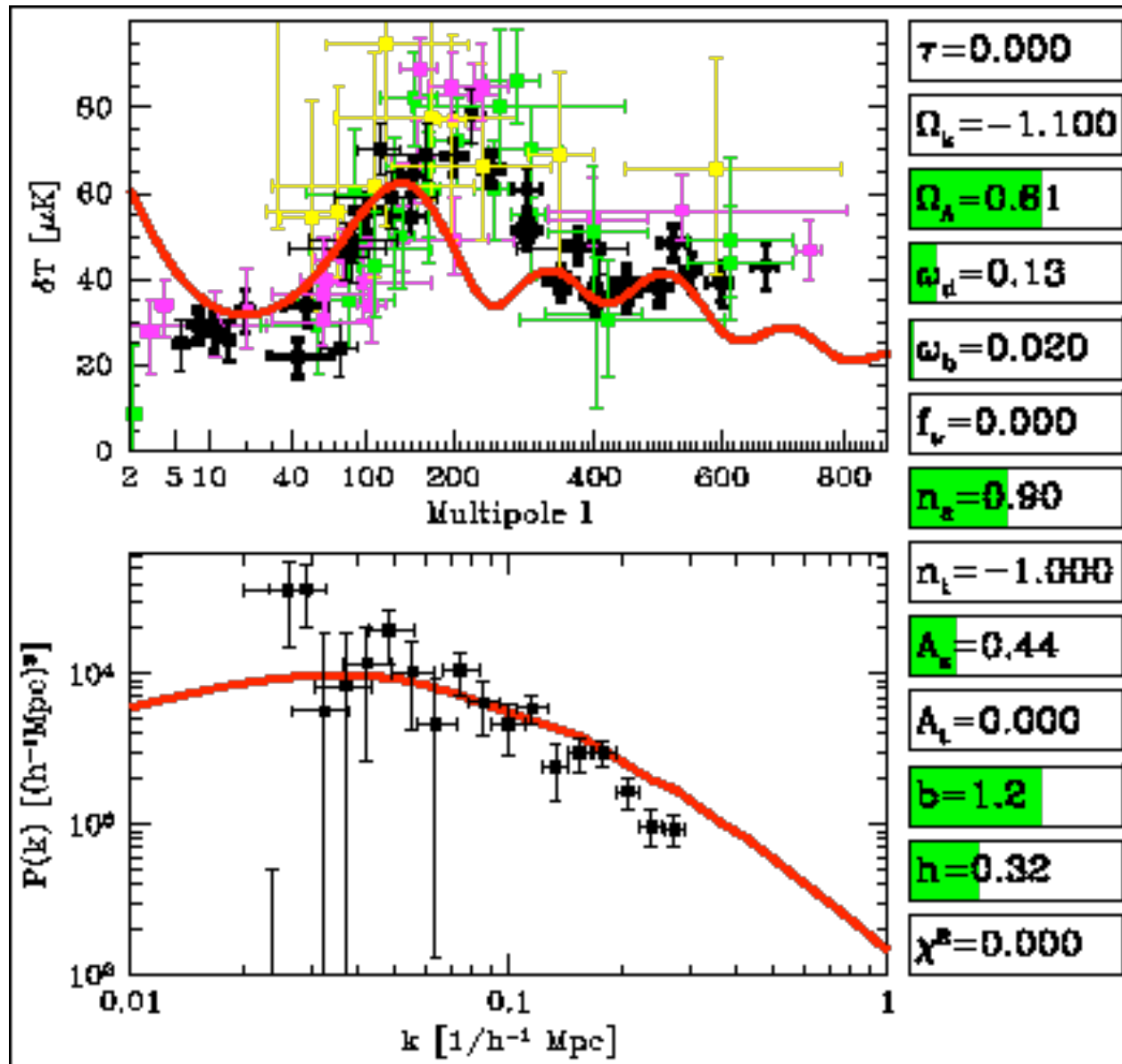
N-spectrum defined via the expectation value of the product of N+1 Fourier transforms of the overdensity field

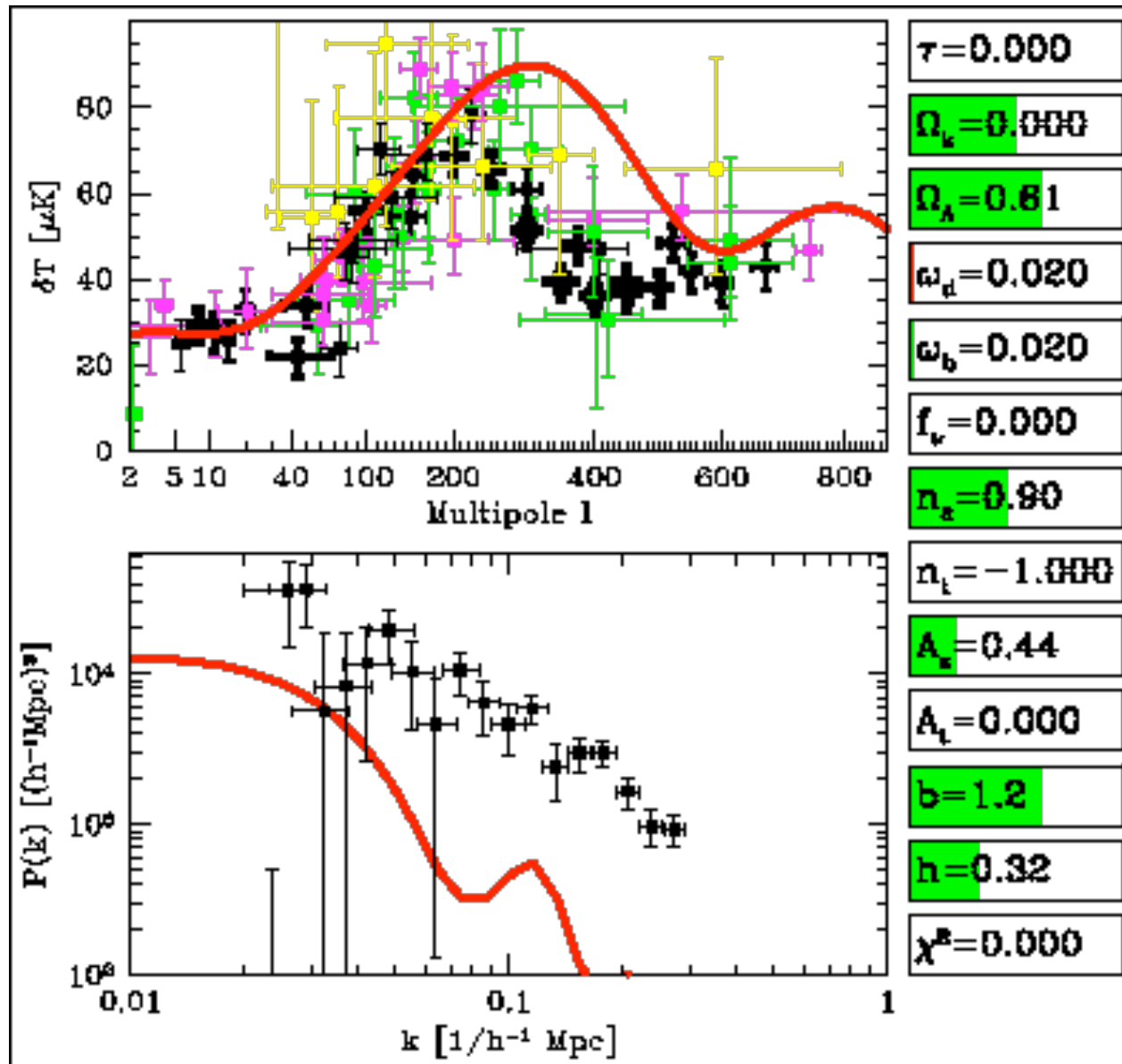
$$\langle \tilde{\delta}(\vec{k}) \tilde{\delta}(\vec{q}) \rangle = (2\pi)^3 P(k) \delta_D(\vec{k} + \vec{q})$$

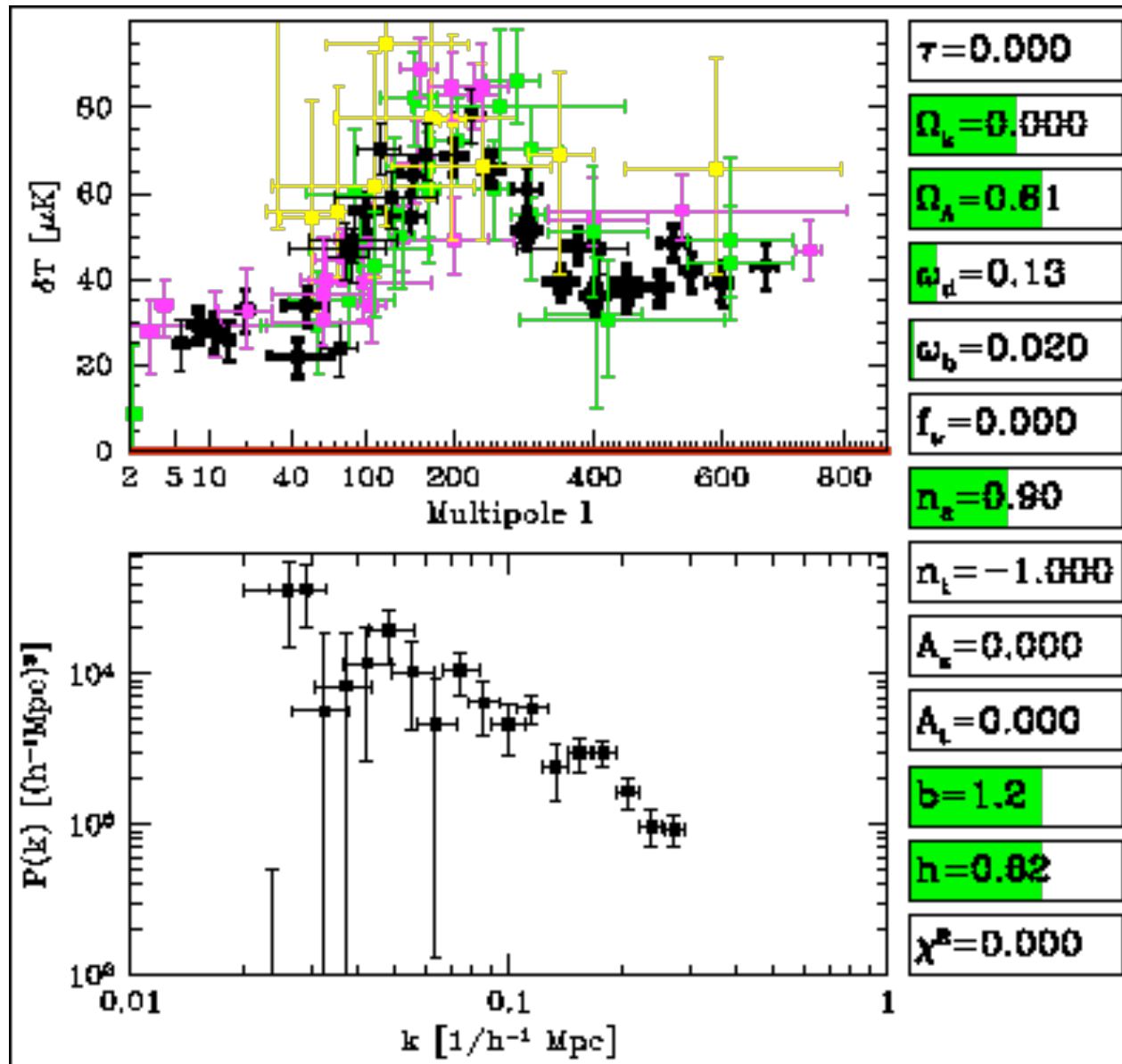
$$\langle \tilde{\delta}(\vec{k}) \tilde{\delta}(\vec{q}) \tilde{\delta}(\vec{p}) \rangle = (2\pi)^3 B(k, q, p) \delta_D(\vec{k} + \vec{q} + \vec{p})$$

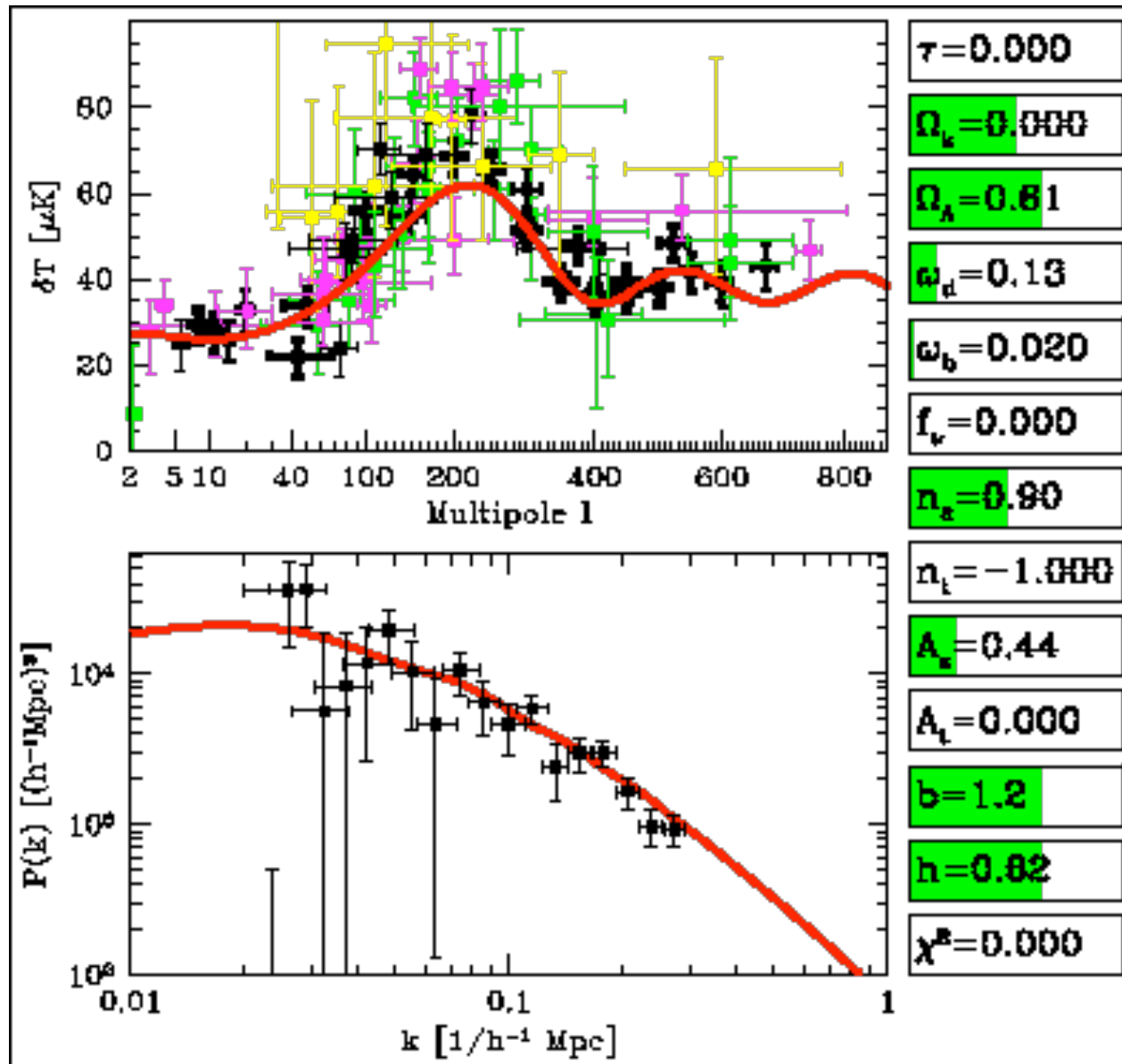
Wiener - Khintchine theorem:

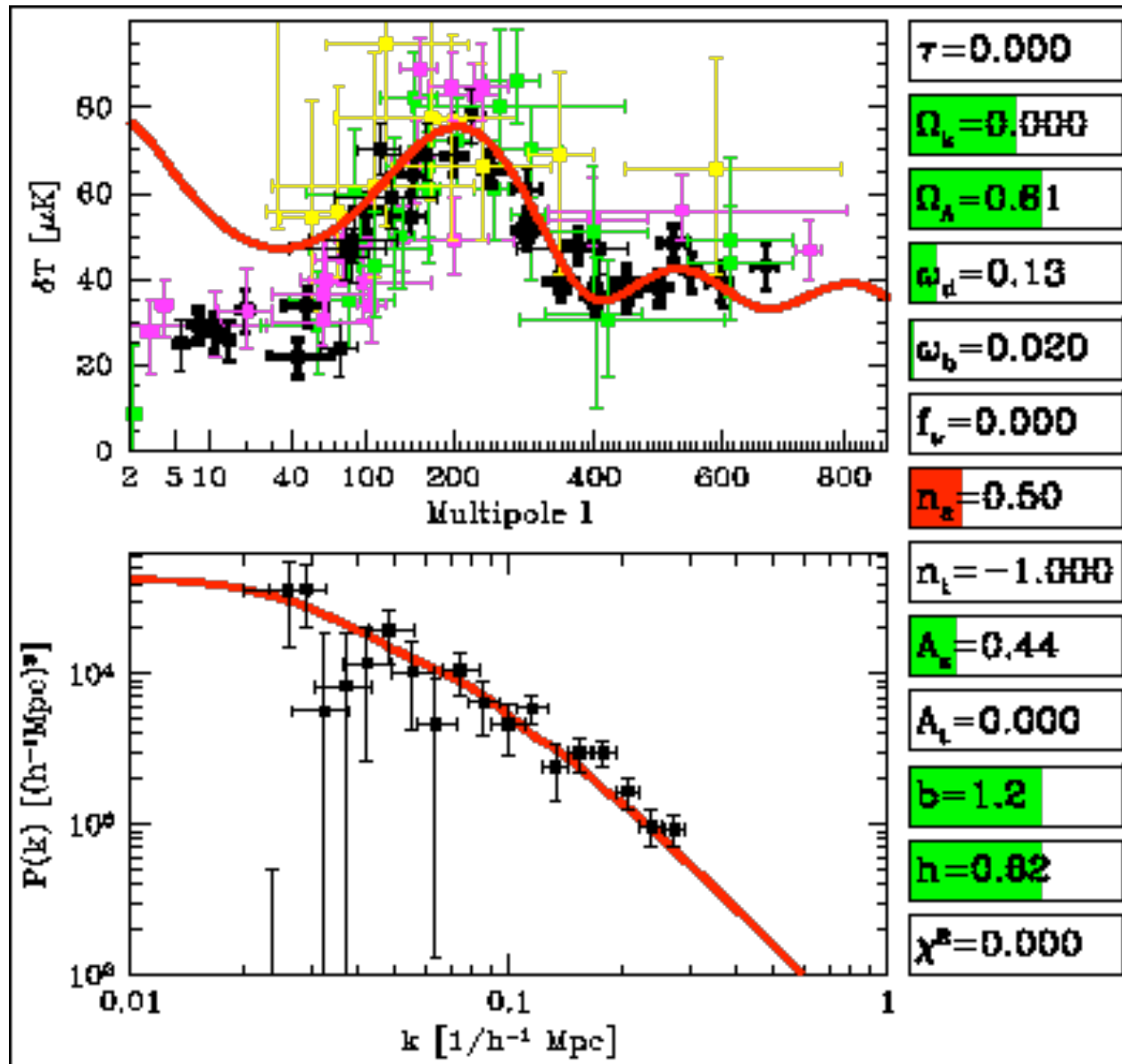
$$\xi(r) = \frac{1}{2\pi^2} \int_0^\infty k^2 P(k) j_0(kr) dk$$











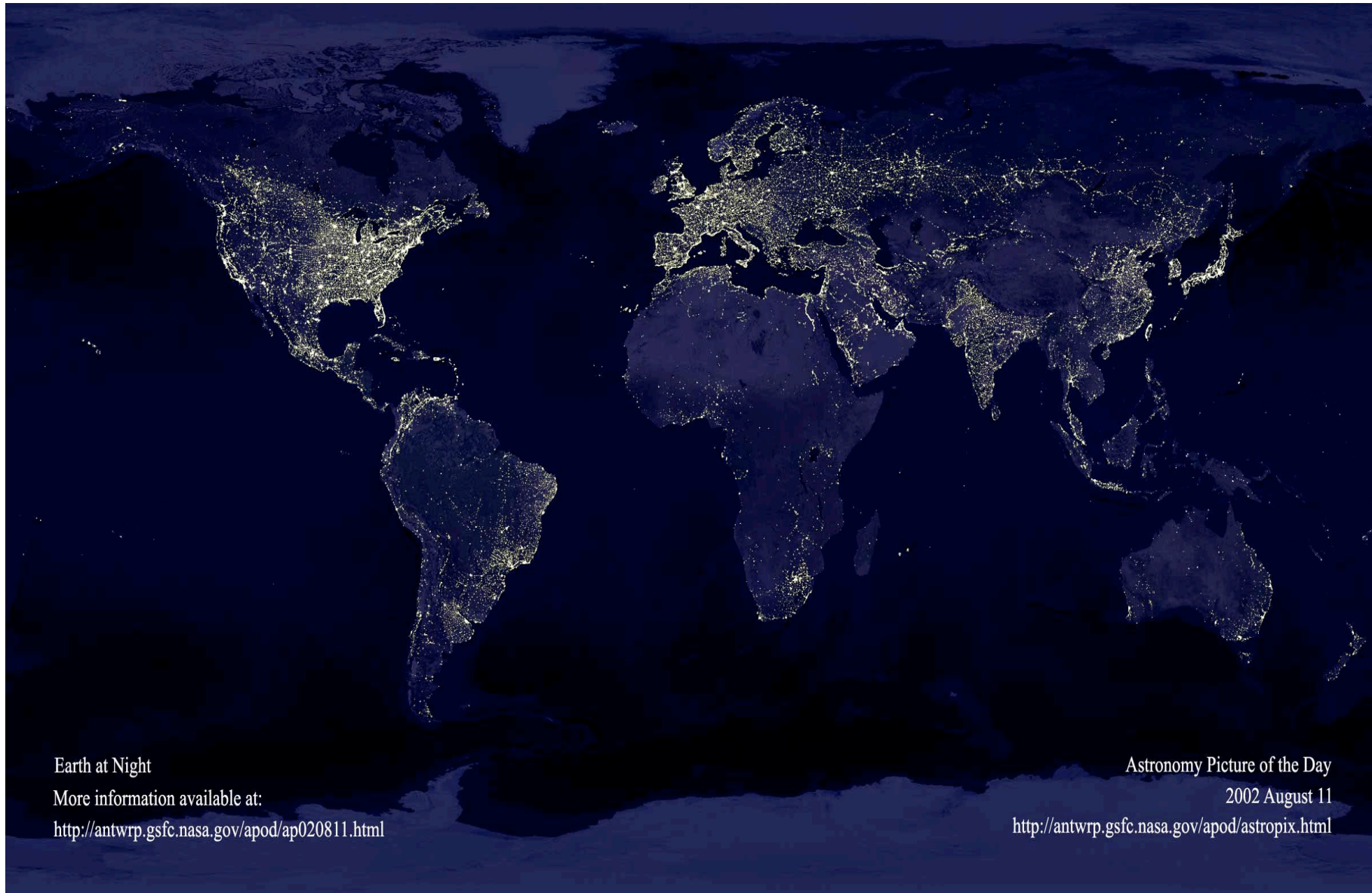


# Complications...

## I- Galaxy biasing (where cosmology meets astrophysics)

# Light does not trace mass

- We observe galaxies and use them to map the cosmic web
- Theory, however, predicts the mass distribution
- So far we have a limited understanding of the galaxy formation process (a complicated (g)astrophysical problem)
- It is clear, anyway, that galaxies form in special regions of the density field with different statistical properties



Earth at Night

More information available at:

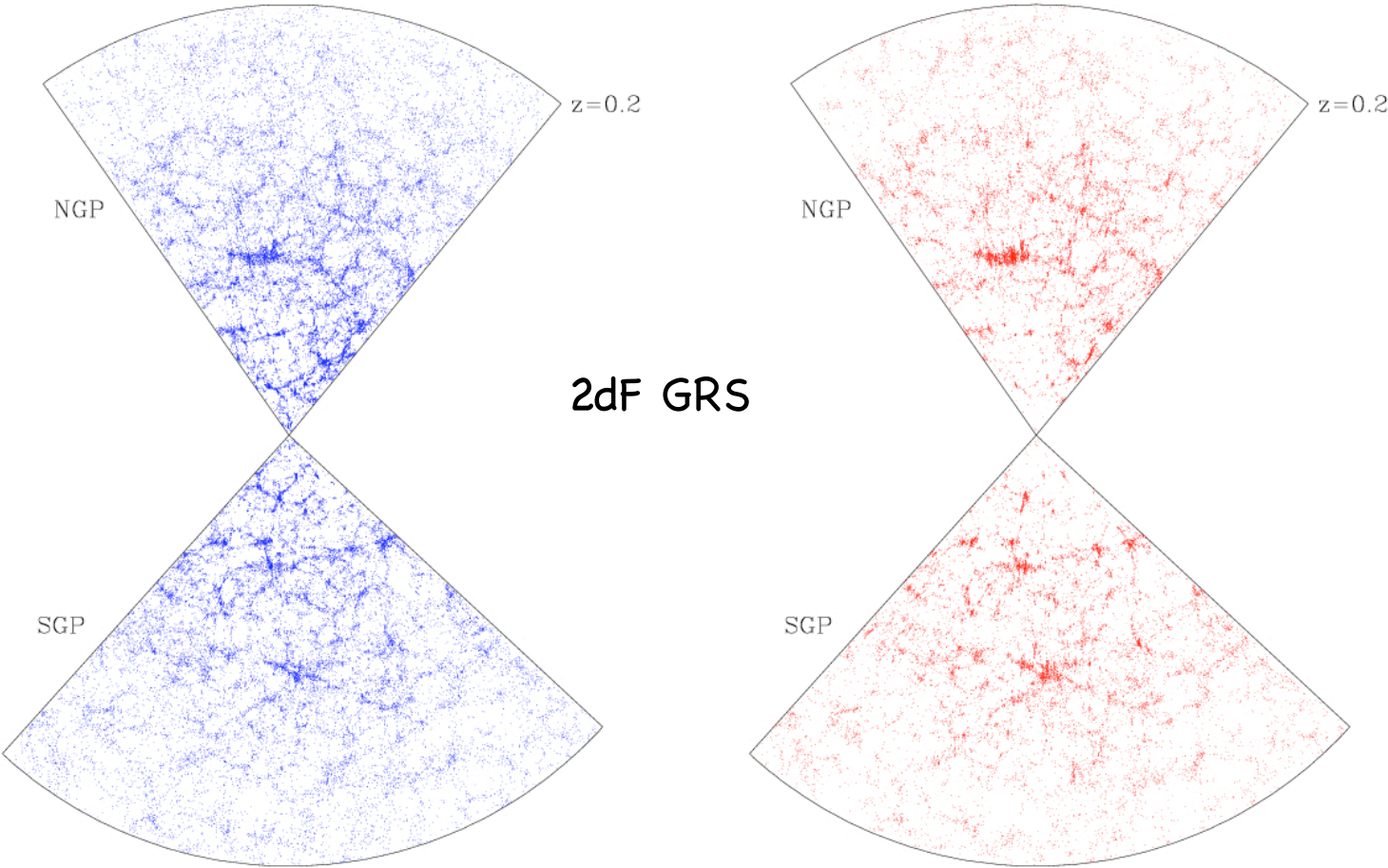
<http://antwrp.gsfc.nasa.gov/apod/ap020811.html>

Astronomy Picture of the Day

2002 August 11

<http://antwrp.gsfc.nasa.gov/apod/astropix.html>

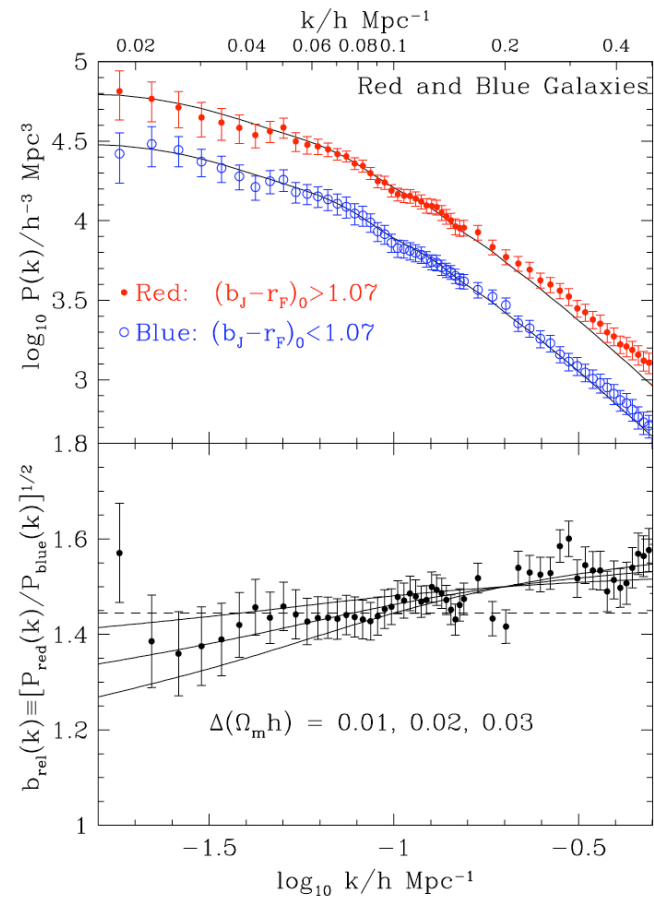
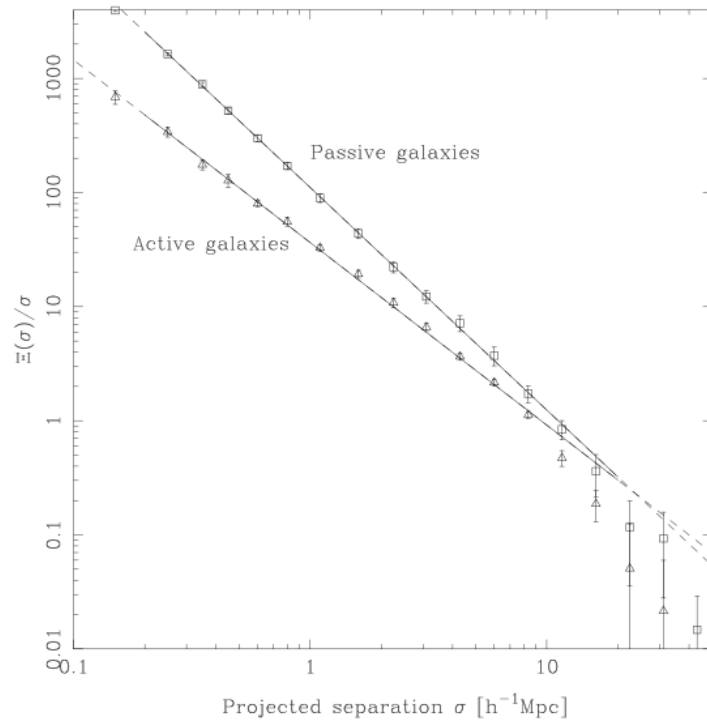
# Galaxy biasing exists



# Galaxy biasing exists

Cole et al. 2005

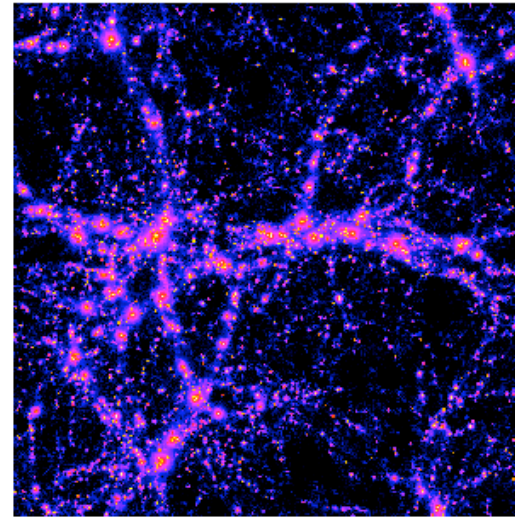
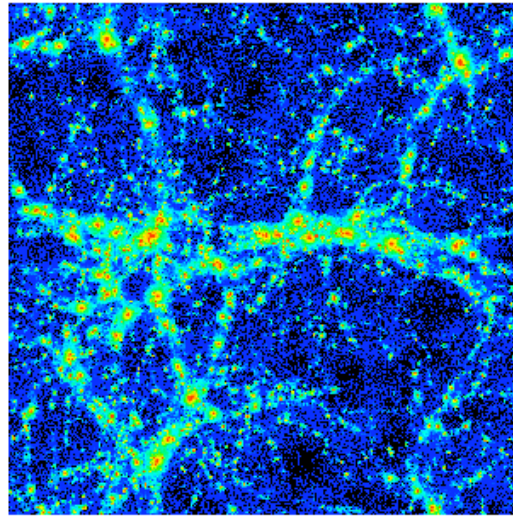
Madgwick et al. 2003



**z=0**

**Dark Matter**

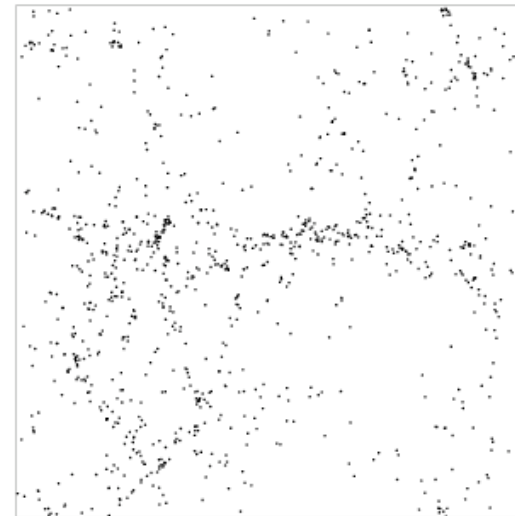
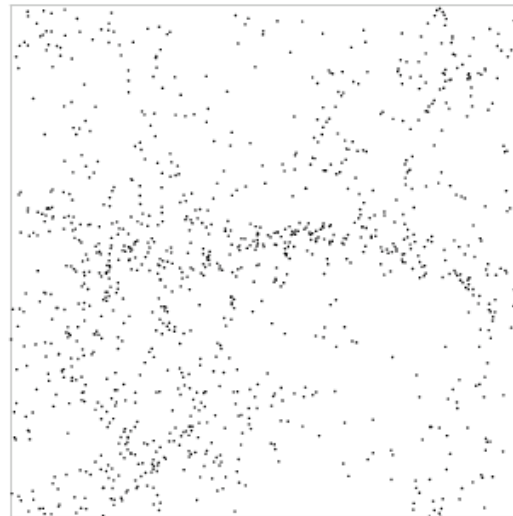
**Gas**



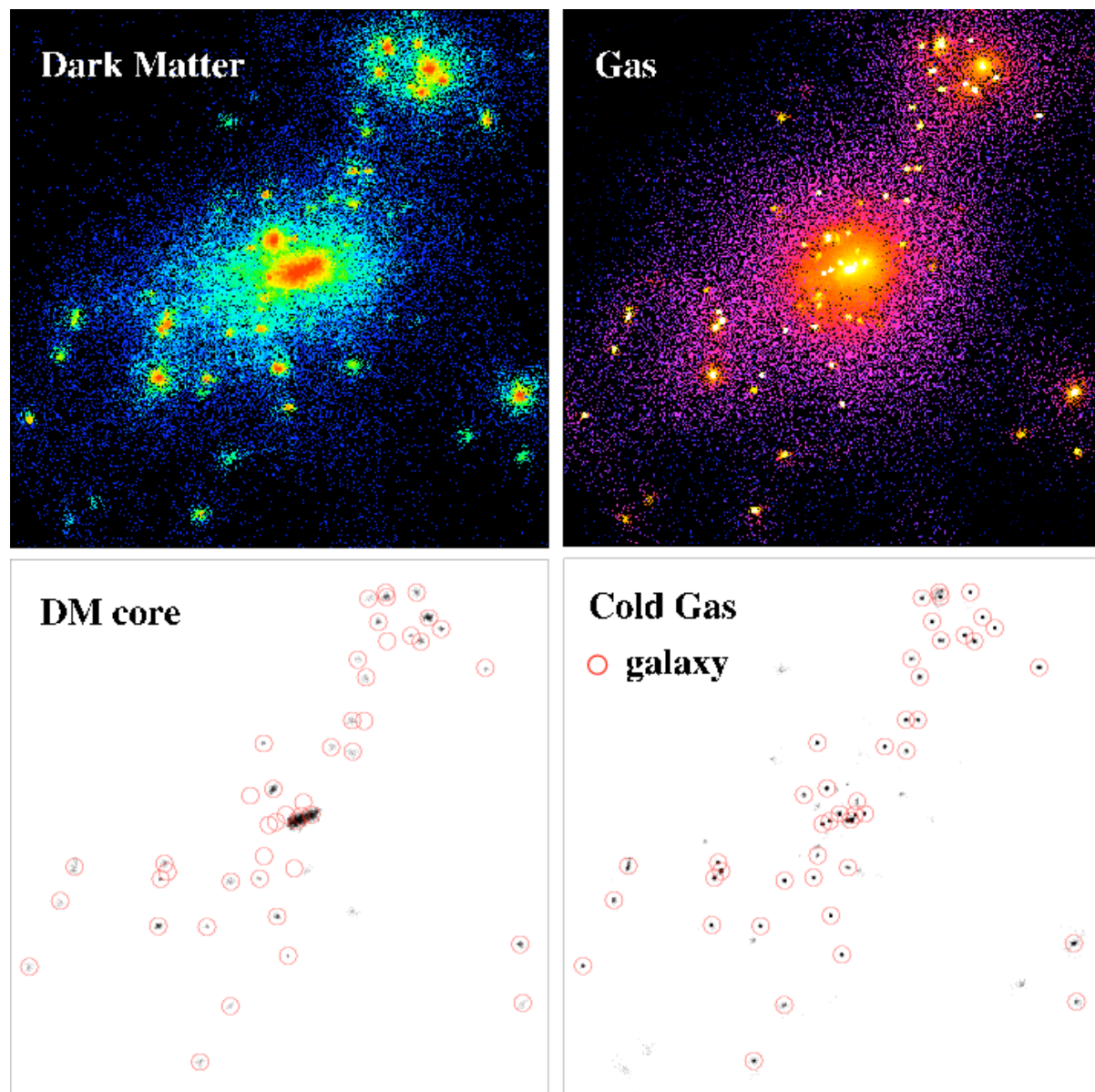
To better understand how to model galaxy biasing, we can compare the distribution of different tracers of the large-scale structure in a numerical simulation

**Dark Halo**

**Galaxy**

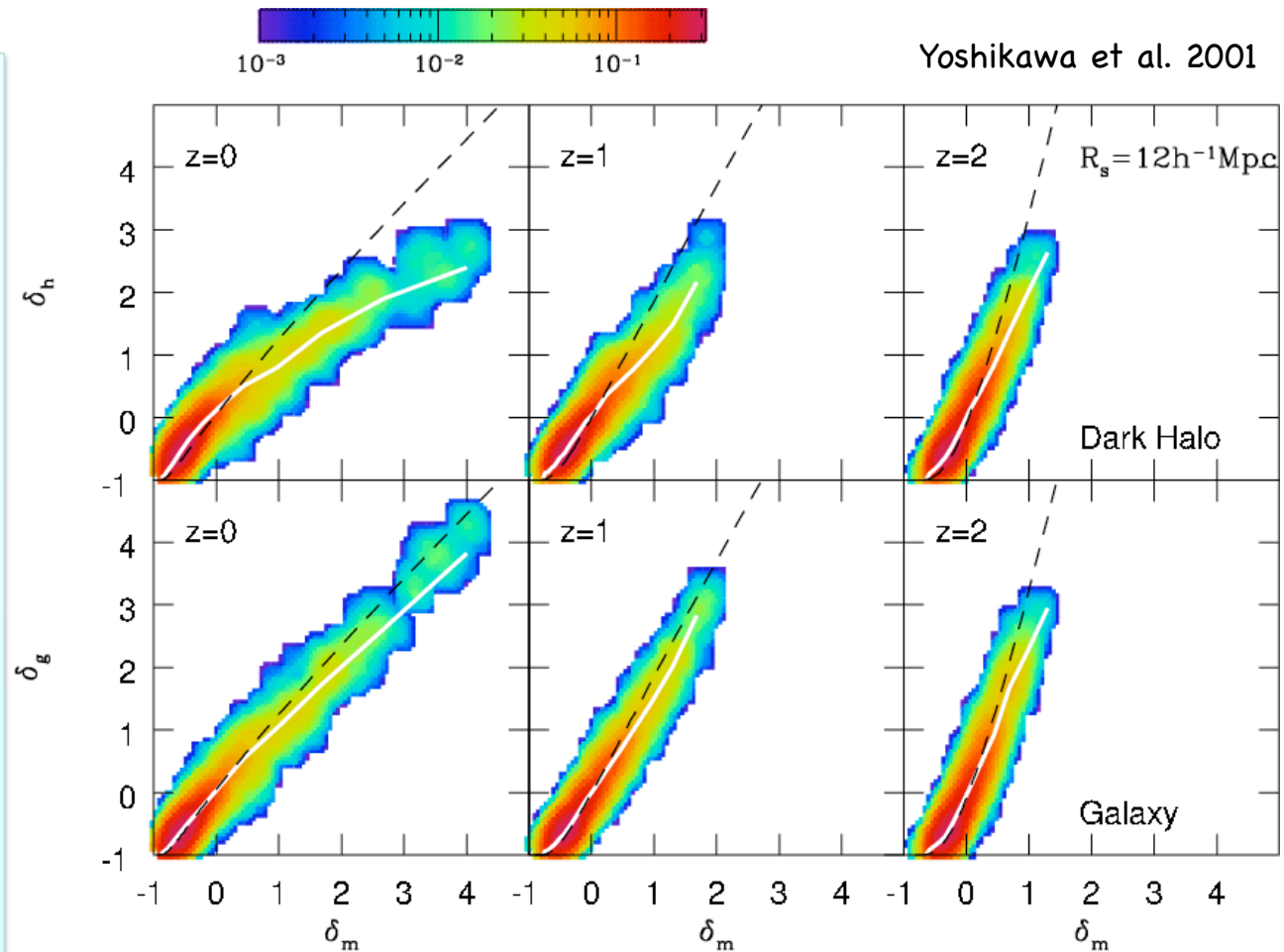


Zooming in  
a galaxy  
cluster



# A local biasing scheme?

Smooth the density distributions of different tracers on the scale  $R_s$  and plot them against the mass density (also smoothed) at the same spatial location. Apart from some scatter there appears to be a deterministic relation.





# A local biasing scheme

- Therefore, we can write that

$$\delta_g(x) = f[\delta_m(x)] + \varepsilon(x)$$

Scatter, noise

- And, for a large smoothing scale, for which  $\delta_m \ll 1$  we can Taylor expand the deterministic part and write (neglecting the scatter)

$$\delta_g(x) \approx b_0 + b_1 \delta_m(x) + \frac{b_2}{2} [\delta_m(x)]^2 + \dots$$

- This implies that

$$P_g(k) = b_1^2 P_m(k) + g[b_1, b_2, P_m(k)]$$

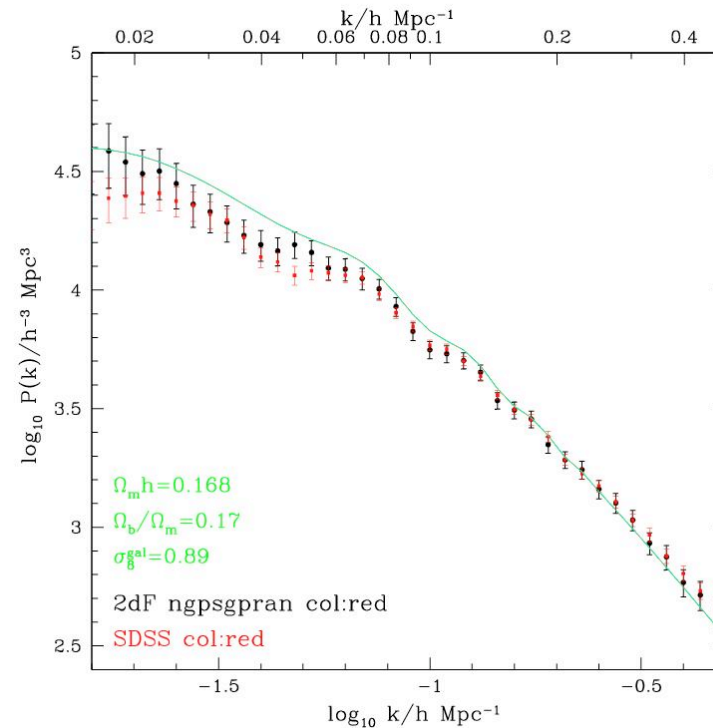
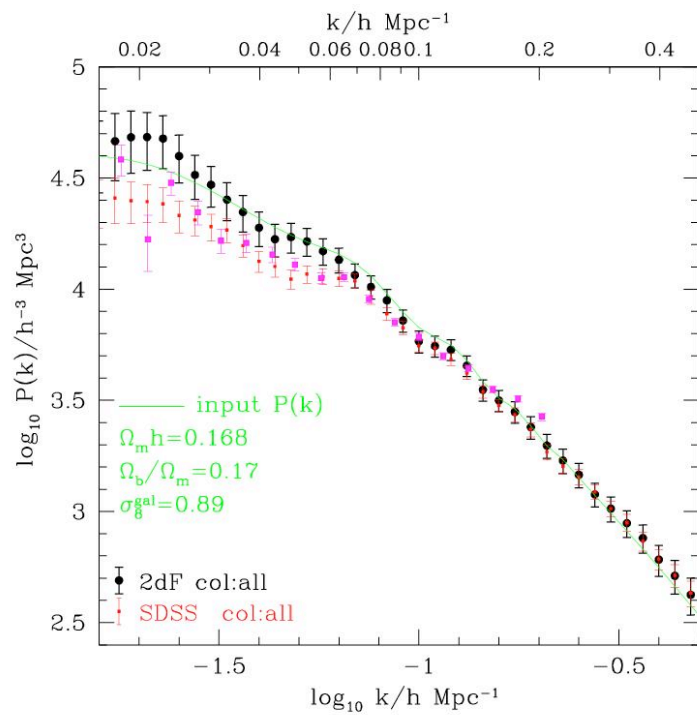
Linear biasing term:  
changes the amplitude

Non-linear biasing term:  
changes the shape

# Power spectrum and galaxy selection

## 2dF GRS vs SDSS

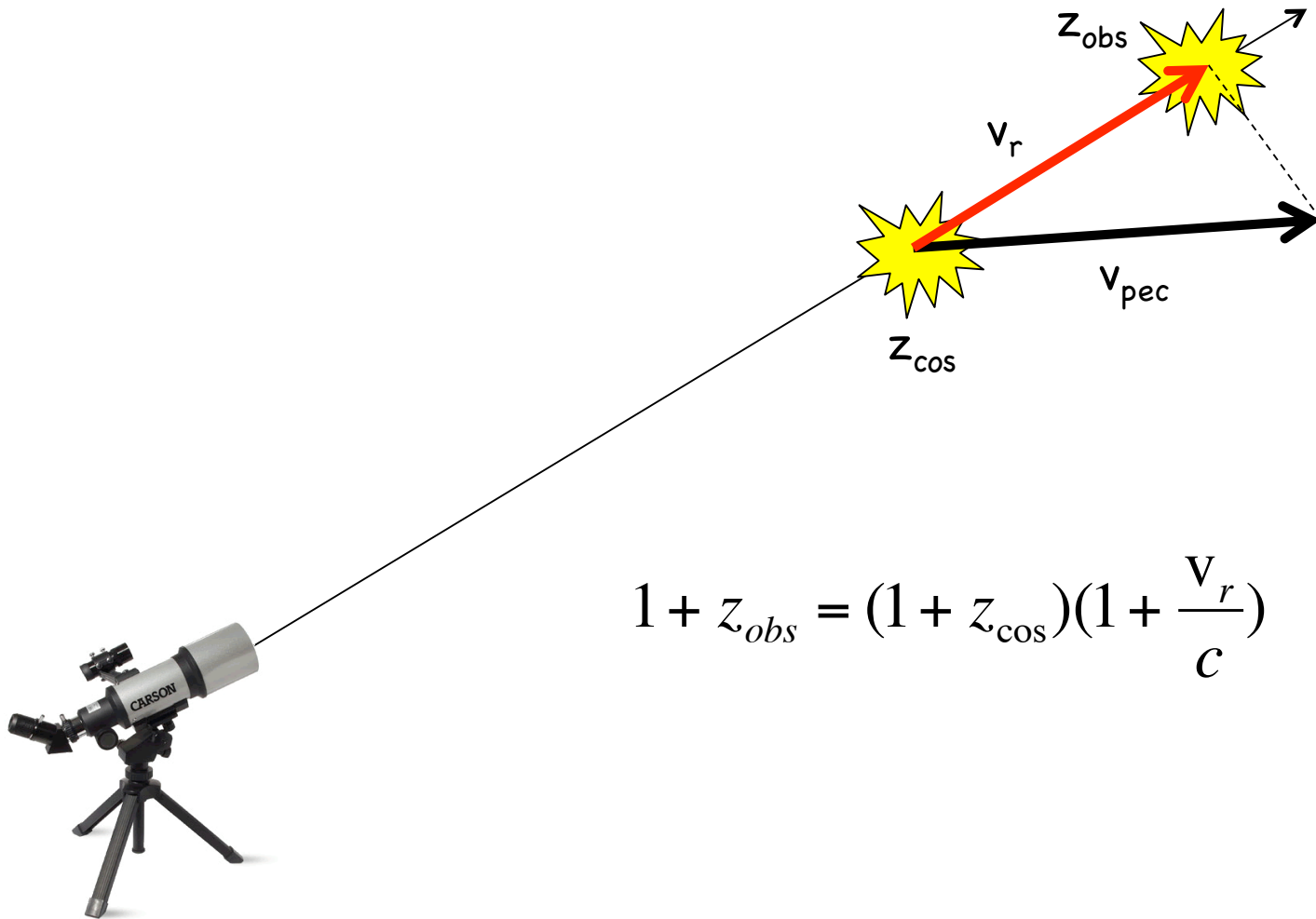
Cole et al. 2005



# Complications...

## II- Redshift-space distortions

# Redshift-space distortions

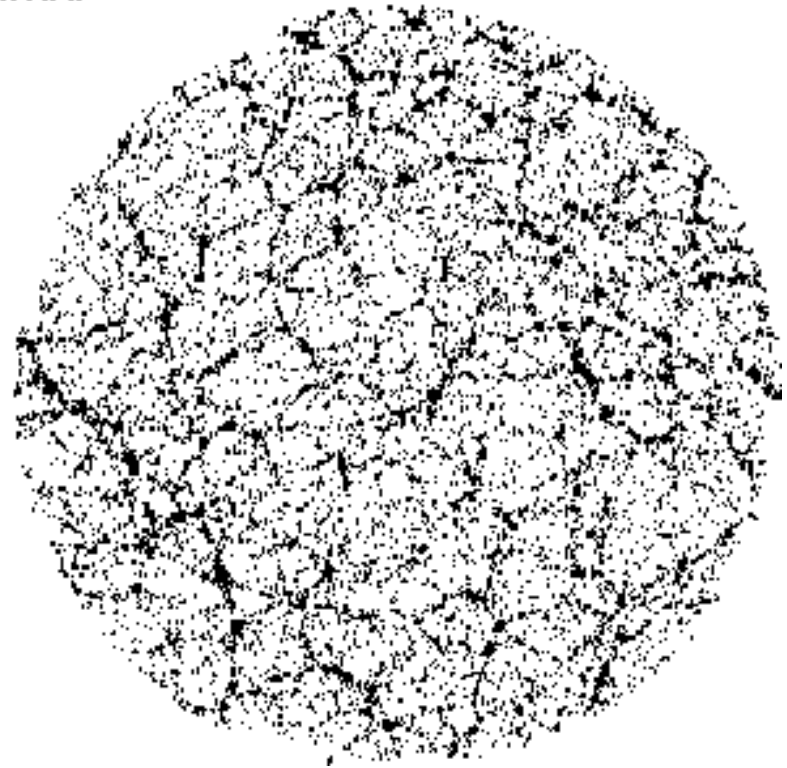


$$1 + z_{obs} = (1 + z_{cos}) \left(1 + \frac{v_r}{c}\right)$$

# Redshift-space distortions

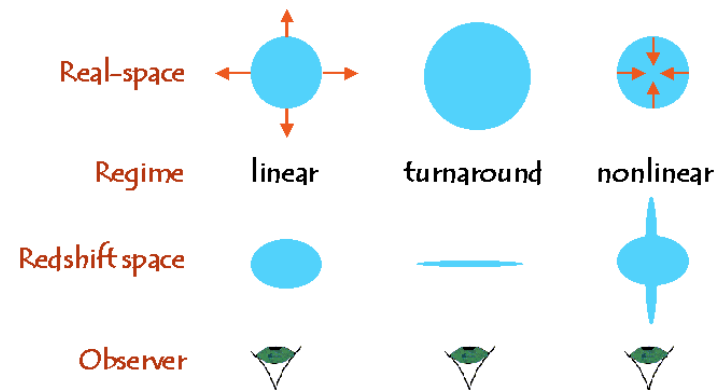
- Density fluctuations generate velocities on top of the global cosmic expansion
- The observed redshift of a galaxy includes a radial Doppler component:  
 $1+z_{\text{obs}} = (1+z_{\text{cos}}) (1+v_r/c)$
- Since we use the redshift to infer the distance to a galaxy, our 3D maps of the universe are “distorted”.

0.00

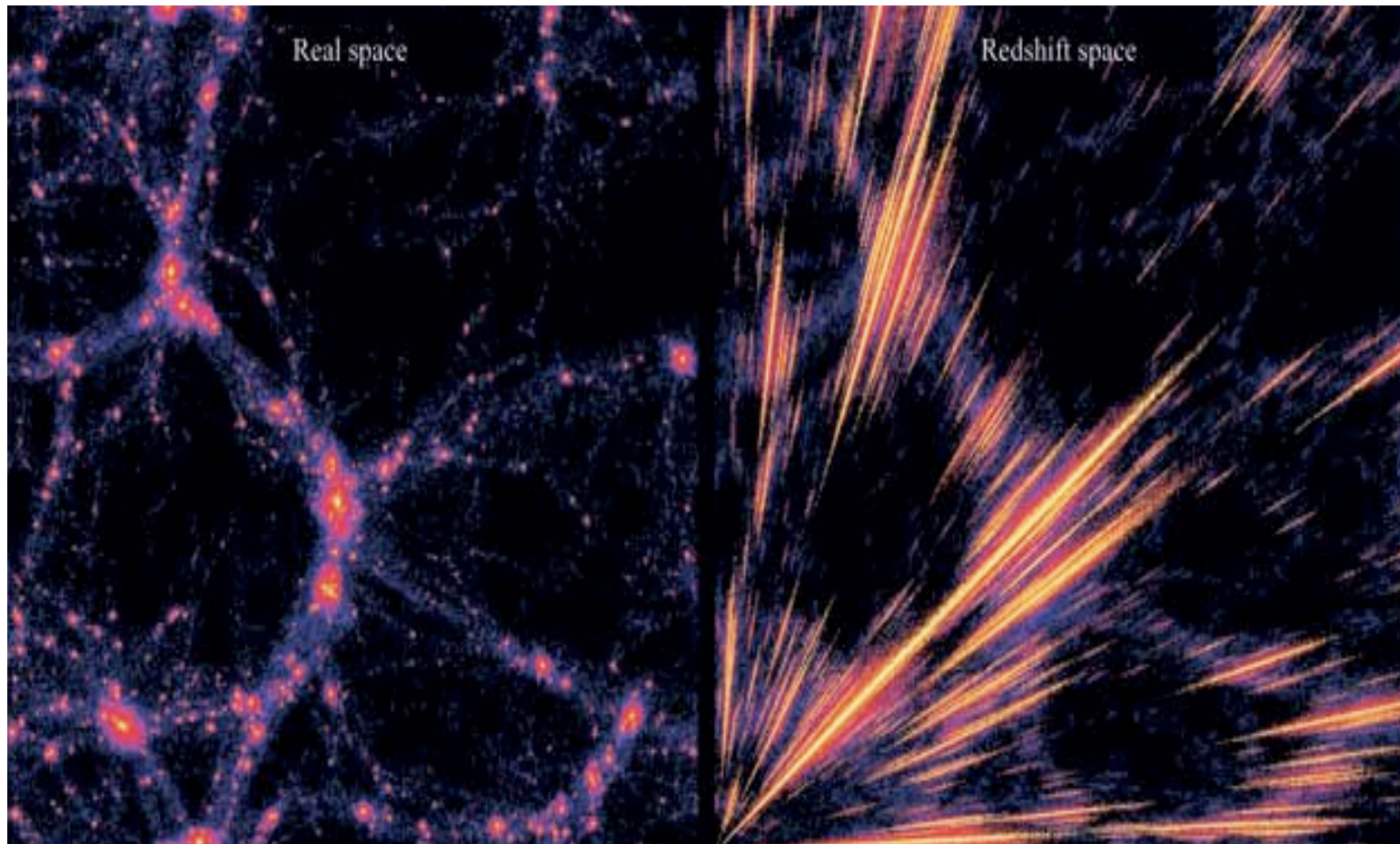


# Redshift distortions

- Fingers of God: Radial stretching pointing towards the observer. They come about because of random velocities in clusters of galaxies
- Large overdensities lead to a coherent infall motion: walls appear denser and thicker, voids bigger and emptier



# A closer look



# Consequences of RS-distortions

- **Bad news:** we will never be able to measure the actual galaxy distribution
- **Good news:** the size of the distortions depends on cosmology. We can use them to learn something about the universe. Recall from cosmology class:


$$\nabla \cdot \mathbf{v} = -\frac{\partial \delta_m}{\partial t} \quad (\text{linearized continuity equation})$$

$$\delta_{g,s}(\vec{k}) = \delta_{g,r}(\vec{k}) \left(1 + \beta \mu^2\right), \quad \beta \approx \frac{\Omega_m^{0.55}}{b_1}, \quad \mu = \cos(\theta_{\vec{r}\vec{k}})$$



# The power spectrum in redshift space

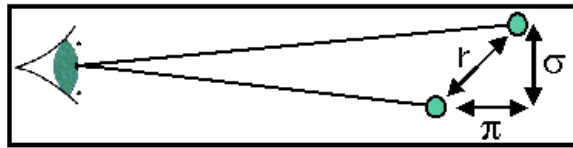
Boost in the average power + anisotropic terms

$$\frac{P_s(k)}{P(k)} = \left(1 + \frac{2}{3}\beta + \frac{1}{5}\beta^2\right) + \left(\frac{4}{3}\beta + \frac{4}{7}\beta^2\right)L_2(\mu) + \frac{8}{35}\beta^2L_4(\mu)$$


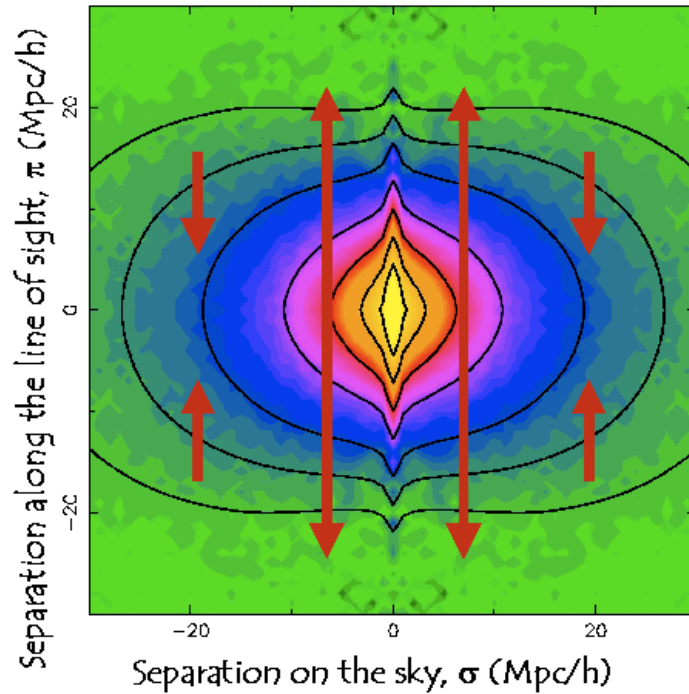
where  $L_i(x)$  denotes the Legendre polynomial of order  $i$

The ratio of the quadrupole to monopole amplitudes is a monotonic function of  $\beta$  that rises from 0 at  $\beta = 0$  to just over unity at  $\beta = 1$ . Redshift distortions can then be used to measure  $\beta$  and, if one already knows  $b_1$ , provide a measure of  $\Omega_m$

# Anisotropic correlation function



Hawkins et al. (2002). astro-ph/0212375  
2dFGRS:  $\beta = 0.47 \pm 0.09$



- Redshift distortions also generate anisotropies in the 2-point correlation function
- The finger-of-god effect can be used to determine the velocity dispersion (and thus the typical mass) of the galaxy groups
- The squashing effect on large scales is equivalent to the quadrupole to monopole ratio in the power spectrum and can be used to further constrain the cosmological model

# Questions?



# Complications...

## III- Shot noise

# Shot noise

- Galaxies are discrete objects
- For mathematical convenience, we describe their distribution with a continuous random field that it is sampled at random positions (note that there are 2 levels of randomness here)
- The effect of the sampling it is called shot noise and we need a model for it (there are infinite ways to do it). The most used is Poisson sampling (but never forget that it is just an approximation):

$$P(N | \delta) = \text{Poisson}[(1 + \delta_{gal}) \bar{n}_{gal} V]$$

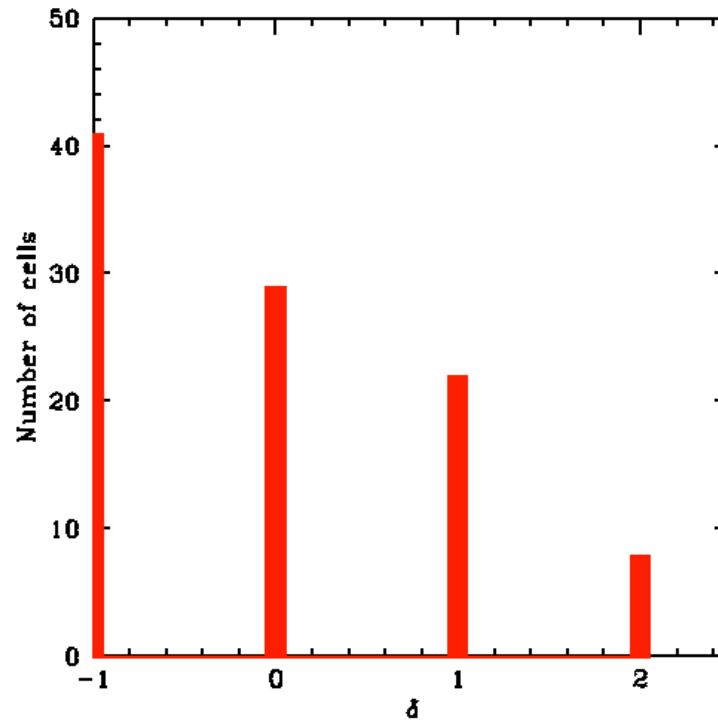
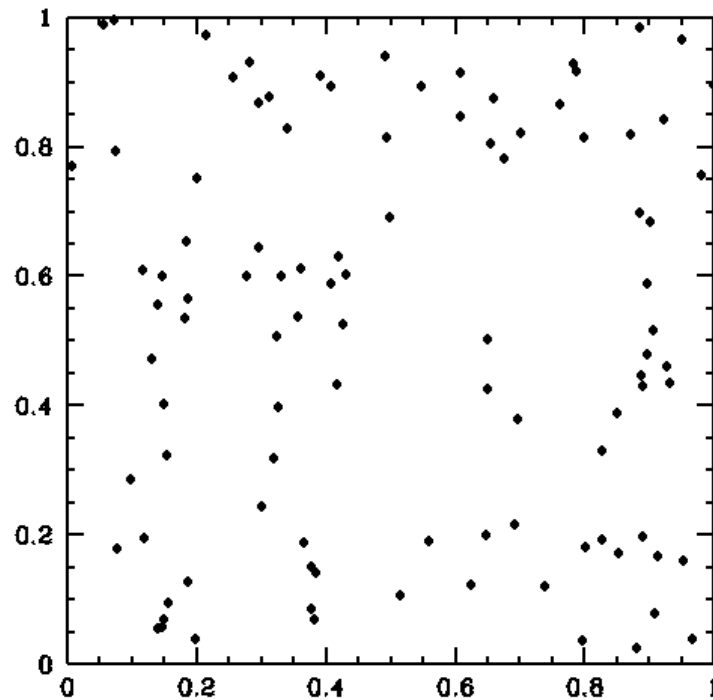
where  $P(N | \delta)$  gives the probability of finding  $N$  galaxies in a volume  $V$  with underlying “continuous” overdensity  $\delta$

# Shot noise

- Shot noise also refers to the effect of self pairs (i.e. pairs made by a single objects) in N-point statistics

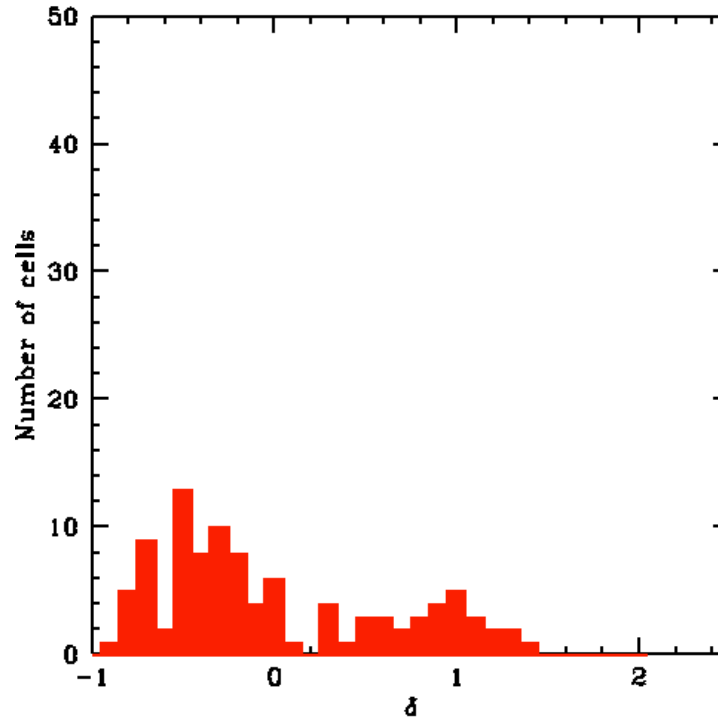
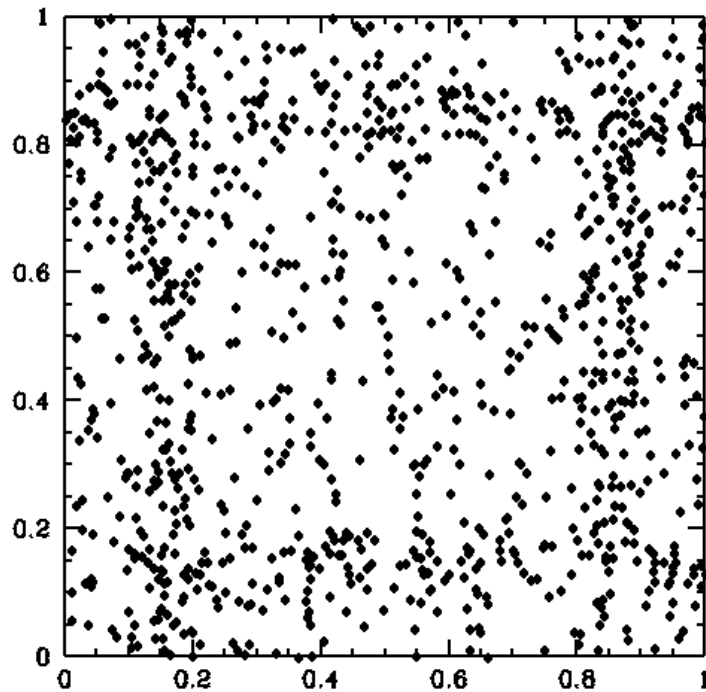
# Shot noise: an example

100 tracers



# Shot noise: an example

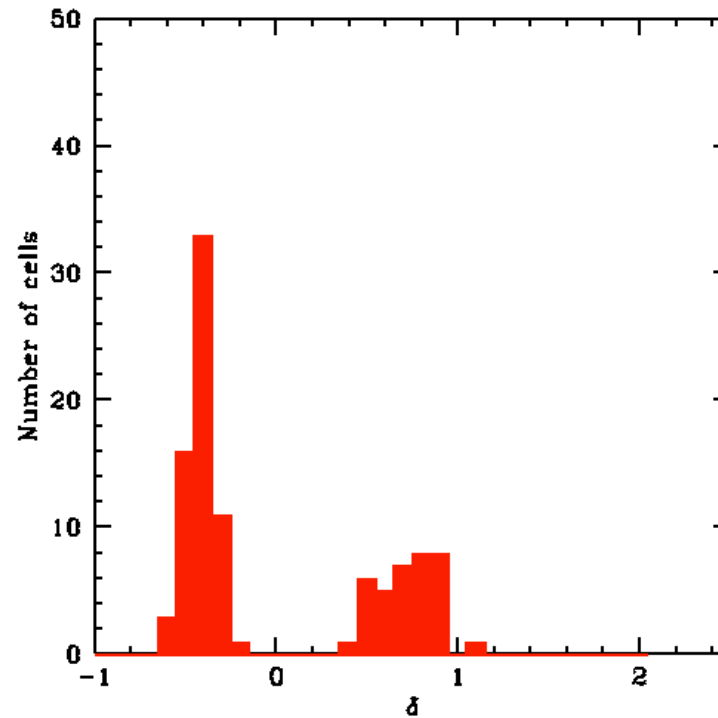
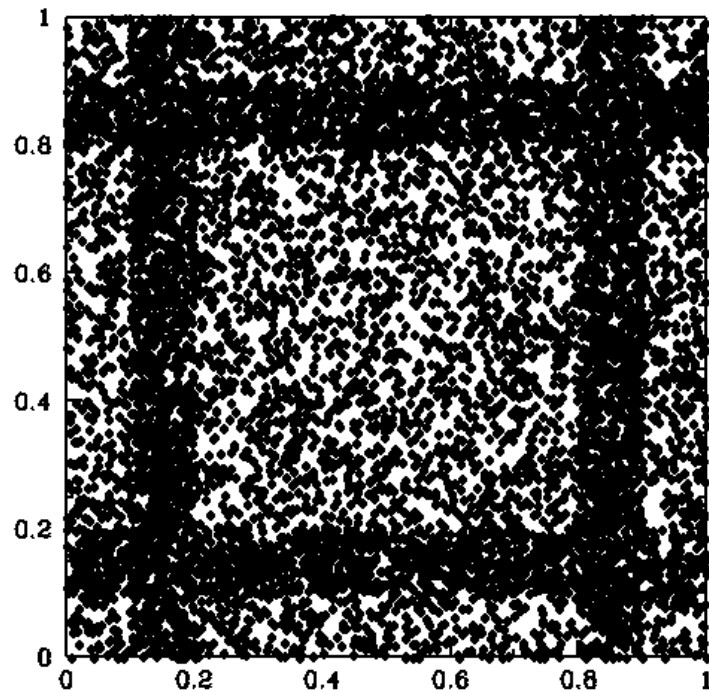
1000 tracers





# Shot noise: an example

10000 tracers



# Shot noise and power spectra

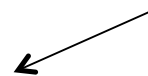
- **Poissonian** shot noise affects power spectra in two ways
- First it adds a (white) systematic component

$$P_{obs}(k) = P(k) + \frac{1}{\bar{n}_{gal}}$$

- Second, it increases statistical uncertainties

$$\frac{\sigma_{P(k)}}{P(k)} = \left(\frac{2}{N}\right)^{1/2} \left(1 + \frac{1}{\bar{n}_{gal}P(k)}\right)$$

N = number of modes in a k-bin (scales as the volume of the survey)



Sample variance (for a Gaussian field)



Shot noise



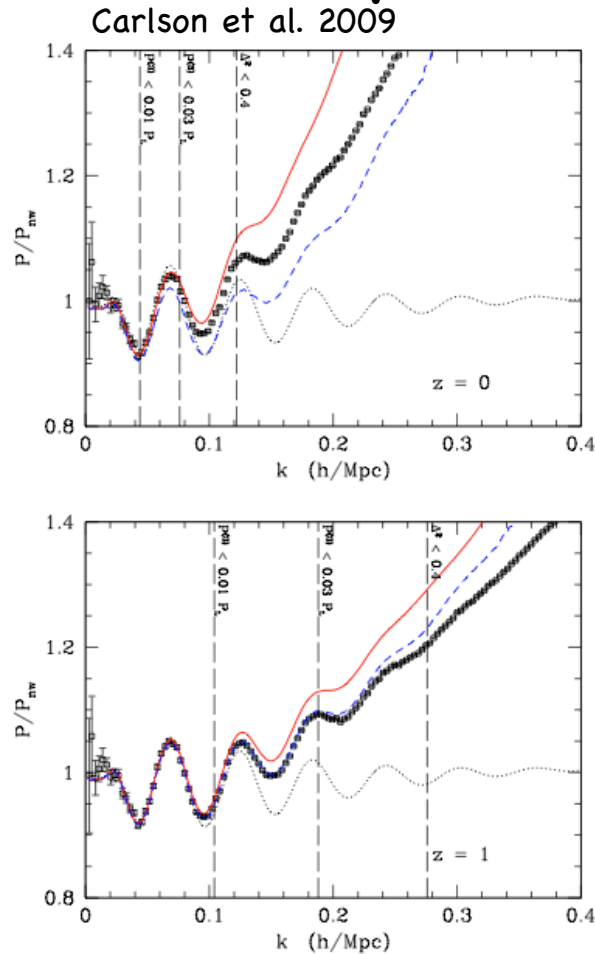
# Question

- What is the effect of shot noise on the 2-point correlation function?

# Complications...

## IV- Non-linear evolution

# Non-linear evolution of the mass power spectrum

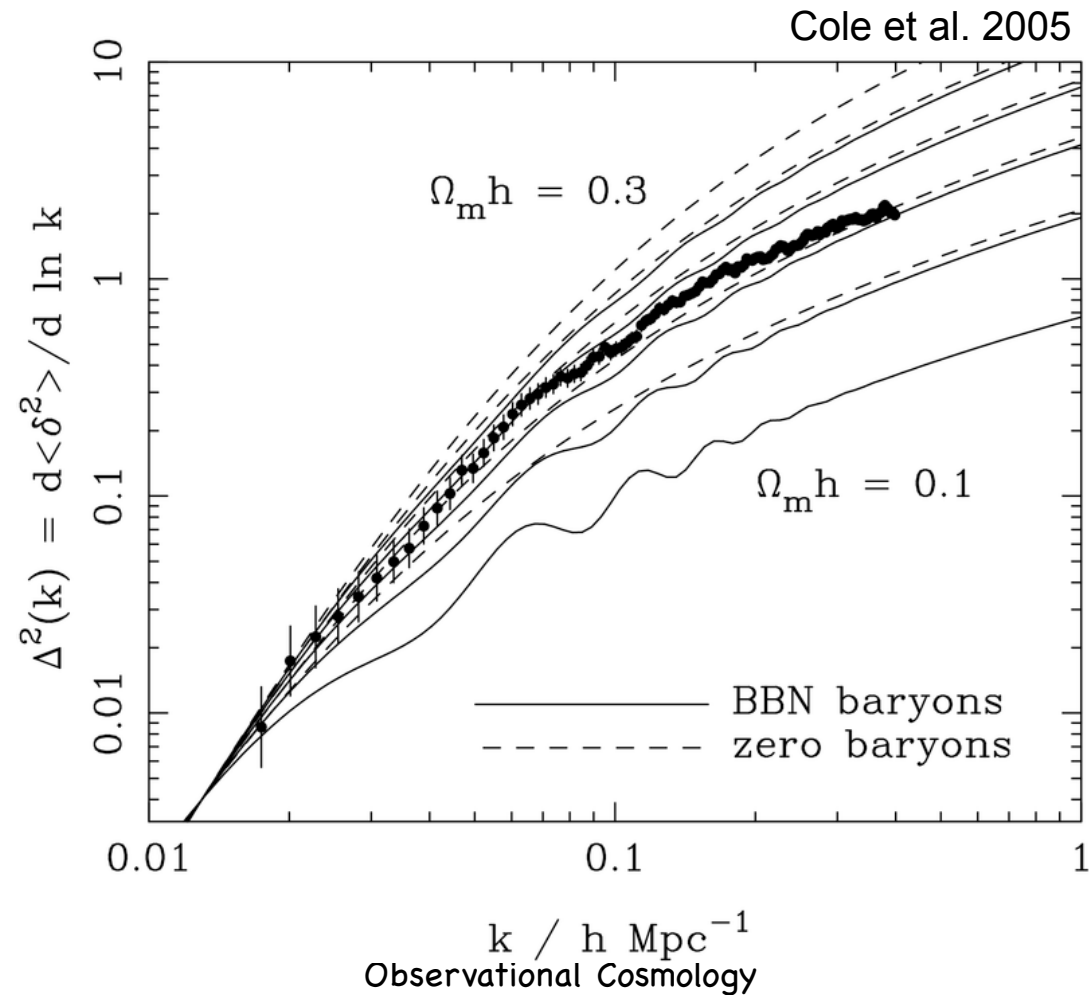


- The non-linear growth of density perturbations changes the shape of their power spectrum from the linear one
- Current models are not very precise in recovering this behaviour for  $k \gg 0.1$  h/Mpc

# Outstanding question

- Do uncertainties in modelling non-linearity, redshift distortions and galaxy bias compromise constraints on cosmological parameters coming from measurements of the galaxy power spectrum?
- Answer: they do not as long as we just use data on very large scales where linear models (for bias and for the evolution of perturbations) are accurate enough.
- This, however, makes errorbars of cosmological parameters big (with respect to the potential of the data) and a lot of efforts are currently made to improve the modelling of the non-linear effects

# Cosmology from galaxy clustering



# What did we learn?

- On separations larger than a few Mpc, models show that the ratio between the matter power spectrum and the galaxy power spectrum is nearly constant
- This implies that we can use the shape of the galaxy power spectrum to determine the cosmology
- Galaxy clustering gives  $\Omega_m h \approx 0.2$ , which for an Hubble constant  $h=0.7$  gives  $\Omega_m \approx 0.25-0.3$
- Combining this with the results of the CMB ( $\Omega_{\text{tot}} \approx 1$ ), it suggests that 75% of the energy in the universe is in an unknown form, the so-called dark energy