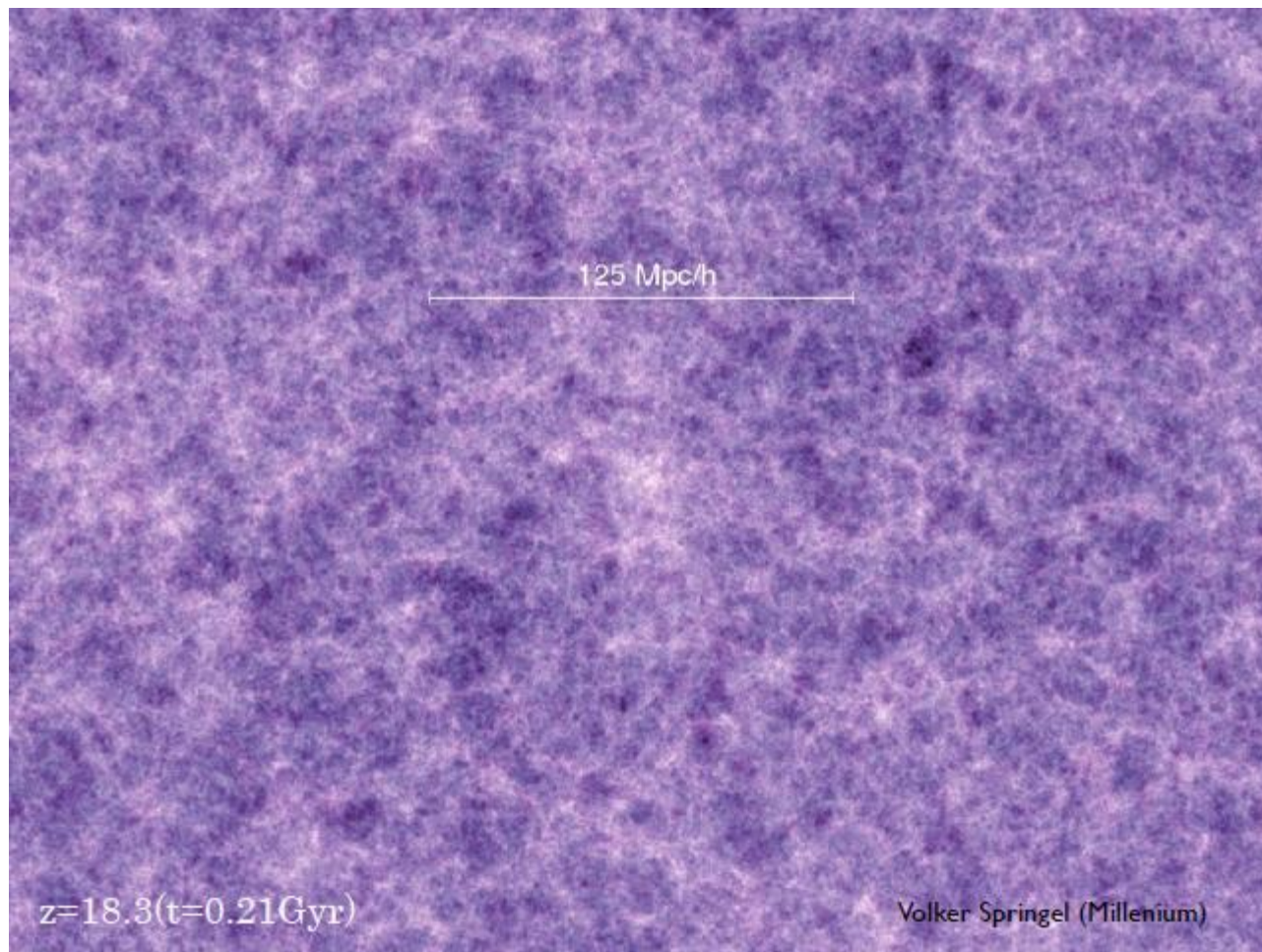


# Phenomenology of dark matter structure formation

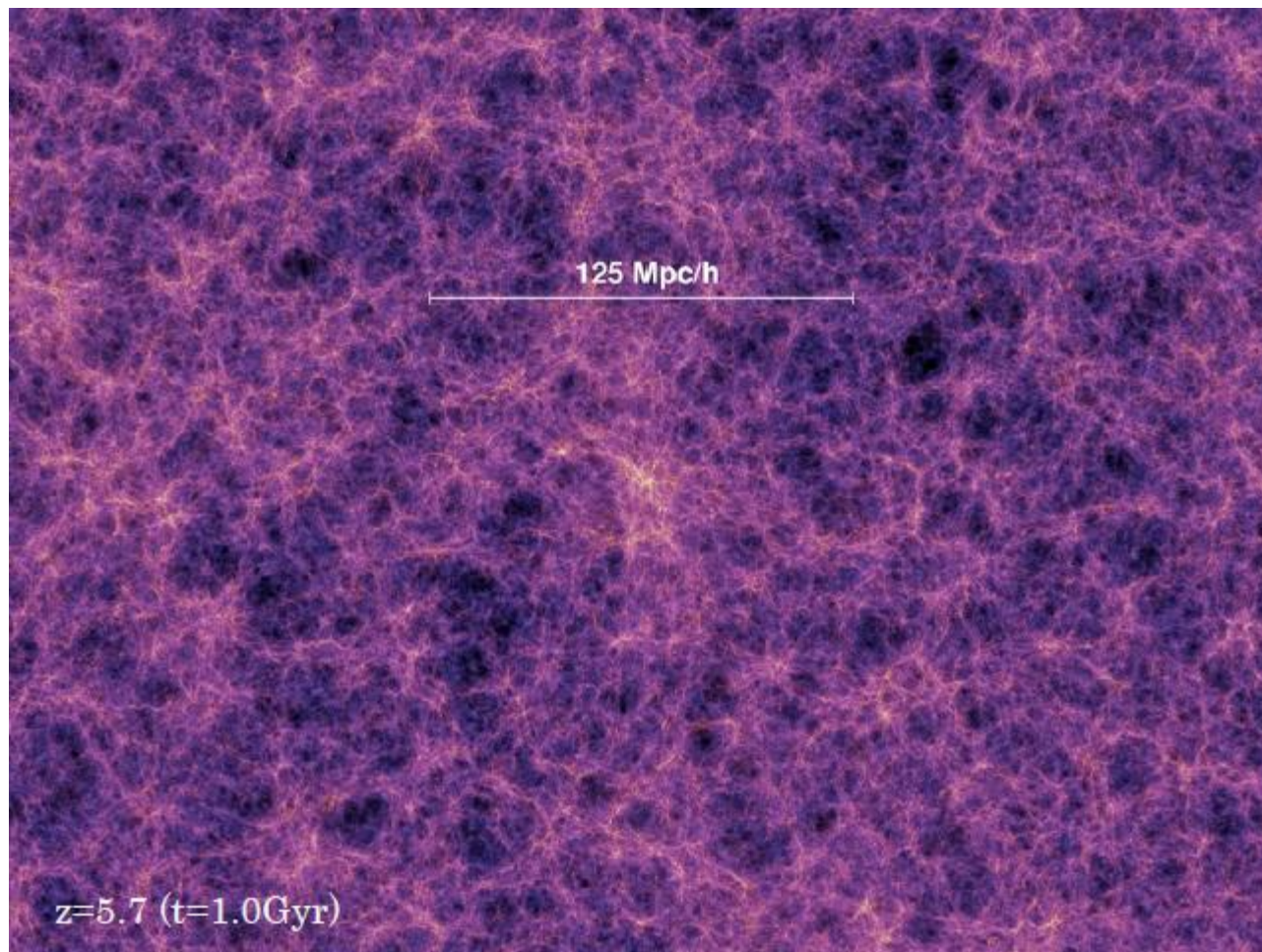
The halo model

Halo abundances and clustering

Halo profiles

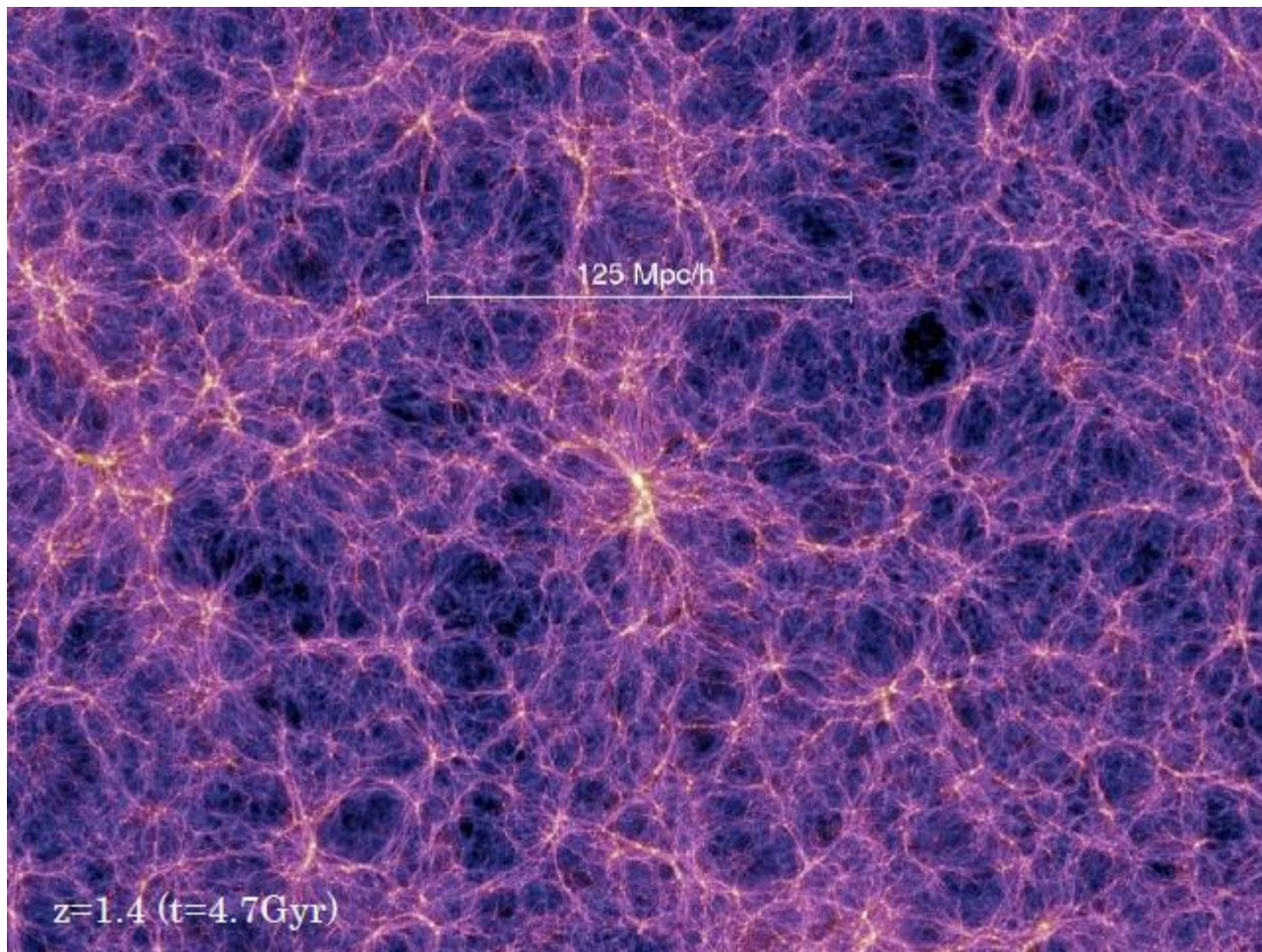


Tuesday, July 17, 2012

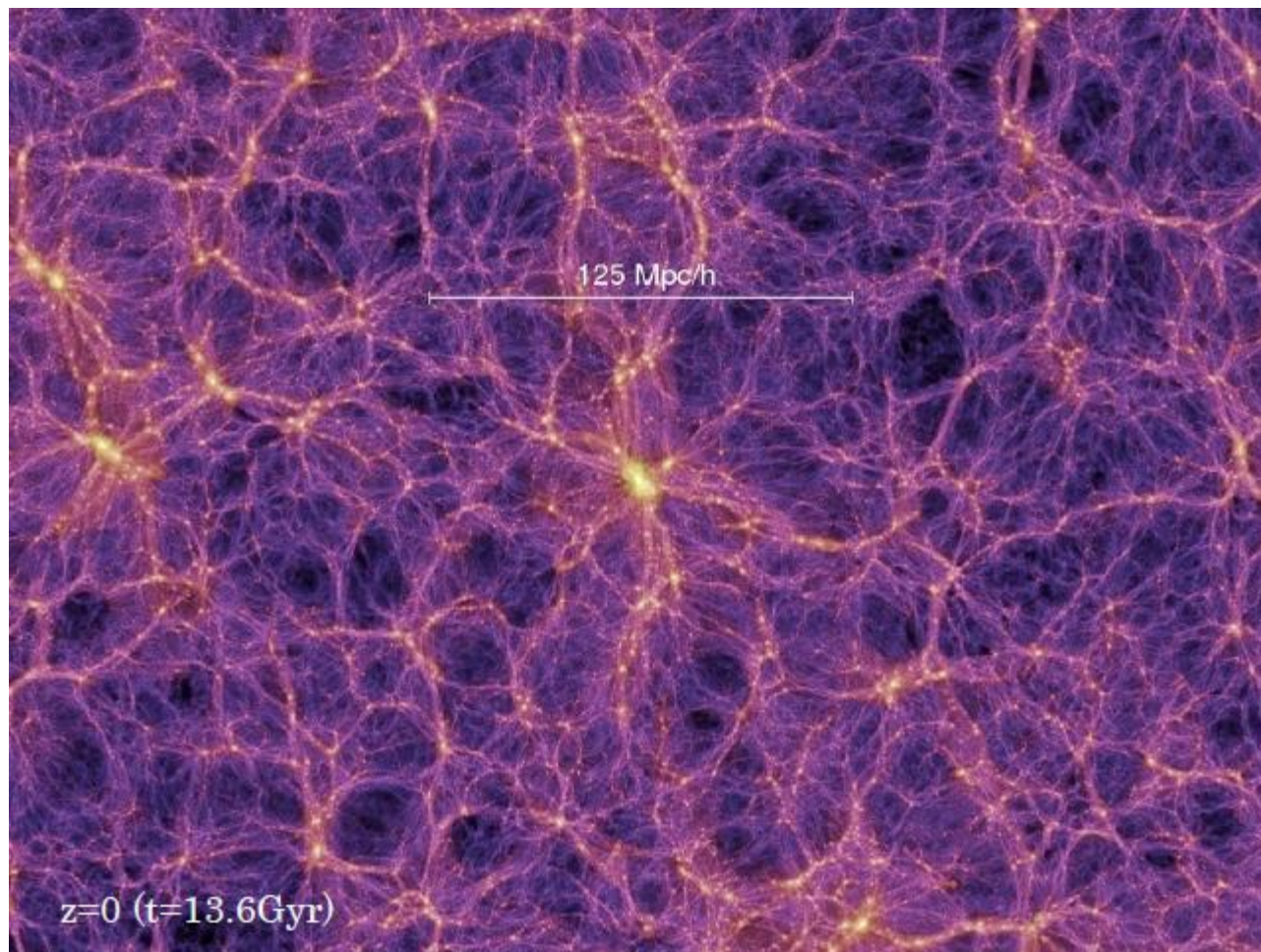


Tuesday, July 17, 2012



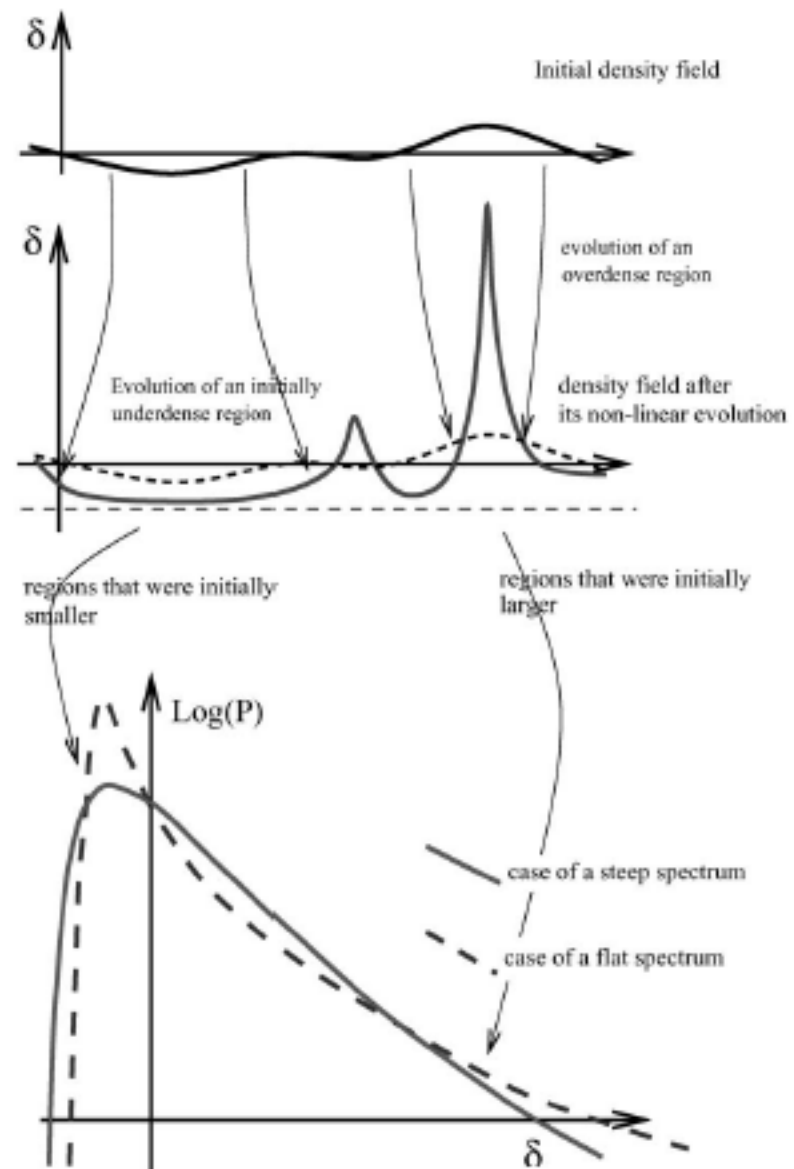


Tuesday, July 17, 2012



Tuesday, July 17, 2012

Initially  
Gaussian  
fluctuation  
field  
becomes  
very non-  
Gaussian





The background of the slide is a Cosmic Microwave Background (CMB) fluctuation field, showing a complex network of purple and blue filaments with bright yellow and orange spots representing high-density regions. Overlaid on this background are five concentric white circles, centered on a bright yellow spot in the middle of the image. The text is written in white, bold, sans-serif font, centered within the circles.

But wait ...  
We should be doing  
this in the INITIAL  
fluctuation field!



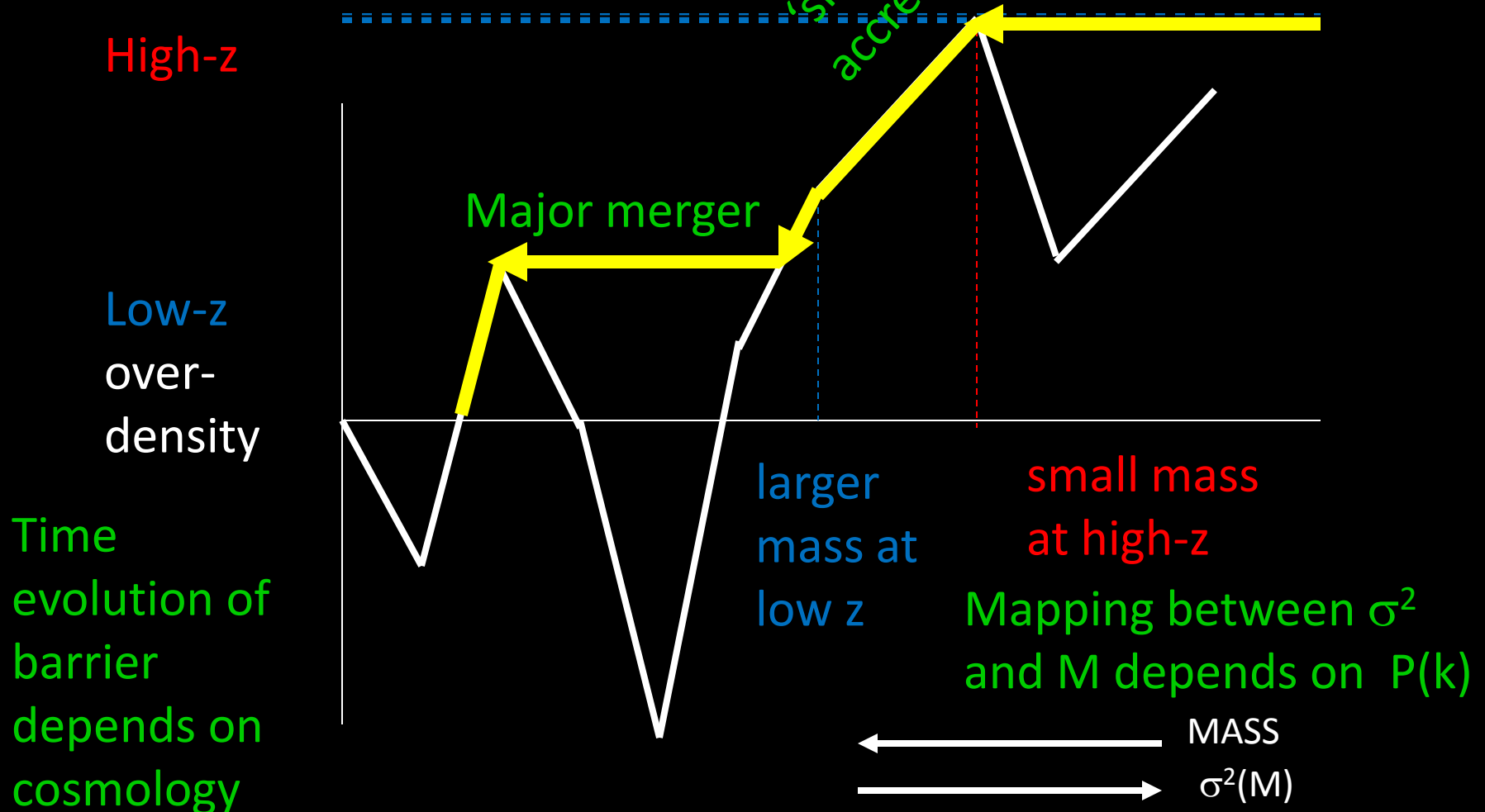


$z=18.3(t=0.21\text{Gyr})$

Volker Springel (Millenium)



# The excursion set approach



# Simplification because...

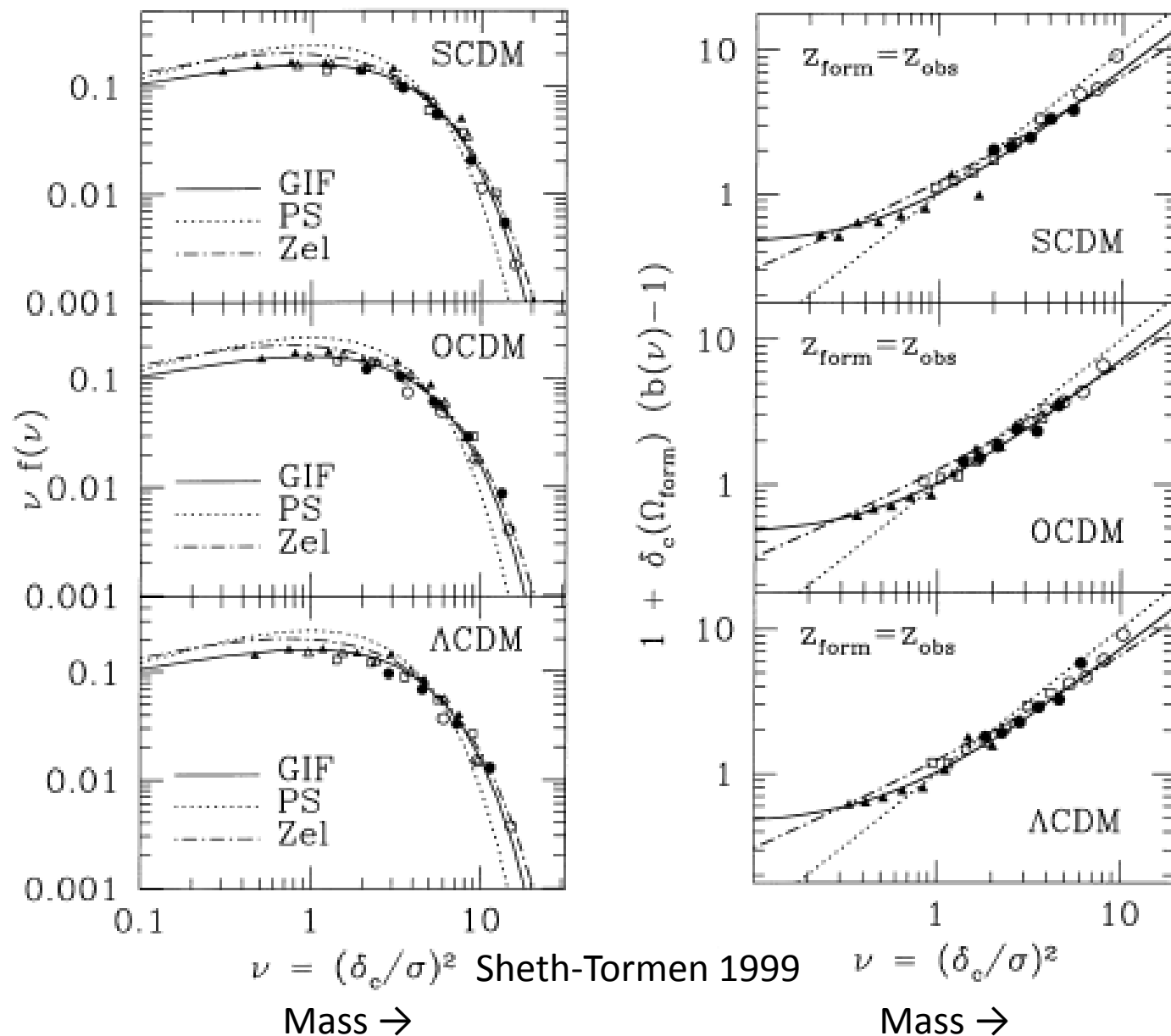
- Everything local
- Evolution determined by cosmology (competition between gravity and expansion)
- Statistics determined by initial fluctuation field: for Gaussian, specified by initial power-spectrum  $P(k)$
- Nearly universal in scaled units:  $\delta_c(z)/\sigma(m)$  where  $\sigma^2(m) = \langle \delta_m^2 \rangle = \int dk/k \ k^3 P(k)/2\pi^2 \ W^2(kR_m)$   $m \propto R_m^3$
- Fact that only very fat cows are spherical is a detail (*crucial* for precision cosmology); in excursion set approach, mass-dependent barrier height increases with distance along walk



(Almost)  
universal  
mass  
function  
and halo  
bias

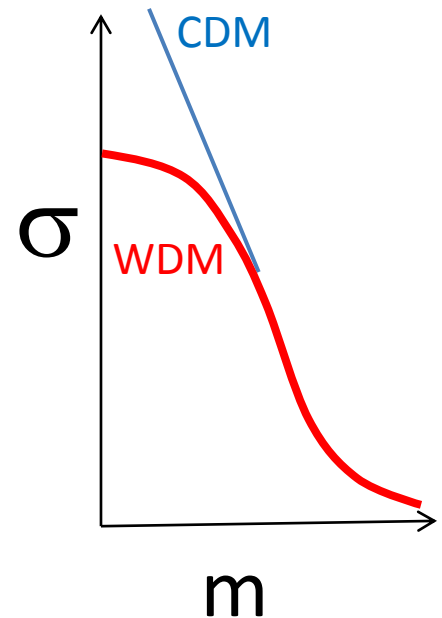
See Paranjape  
et al (2013) for  
recent progress  
in modeling this  
from first  
principles

See Castorina et  
al. (2014) for  $\nu$ 's



# For WDM ...

- At small enough  $m$ ,  $\sigma(m)$  is flat
- Fraction of walks which didn't cross barrier prior to this  $\sigma =$  **non-negligible smooth component which was never bound to anything**
- $f_{\text{smooth}}$  should be larger at high  $z$
- **Fewer halos (progenitors) at high  $z$  mean less concentrated halos at low  $z$**
- $f_{\text{smooth}}$  should be larger in voids = voids are 'emptier' (even more so if  $\delta_c(m)$  larger at small  $m$ )





## Spherical evolution mapping ...

$$(R_{\text{initial}}/R)^3 = \text{Mass}/(\rho_{\text{com}} \text{Volume}) =$$

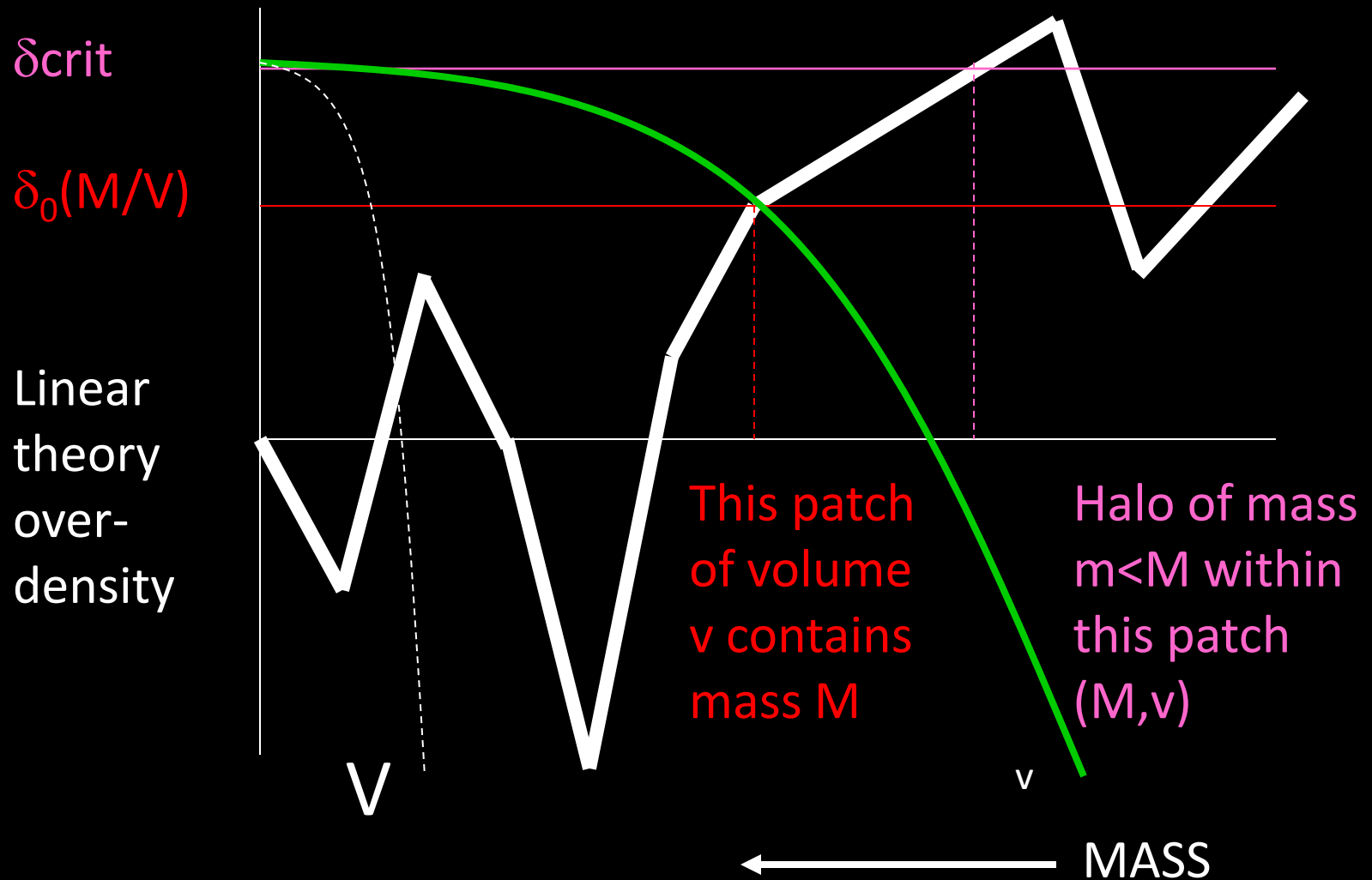
$$1 + \delta \approx (1 - \delta_0/\delta_{\text{sc}})^{-\delta_{\text{sc}}}$$

... can be inverted:

$$(\delta_0/\delta_{\text{sc}}) \approx 1 - (M/\rho_{\text{com}} V)^{-1/\delta_{\text{sc}}}$$

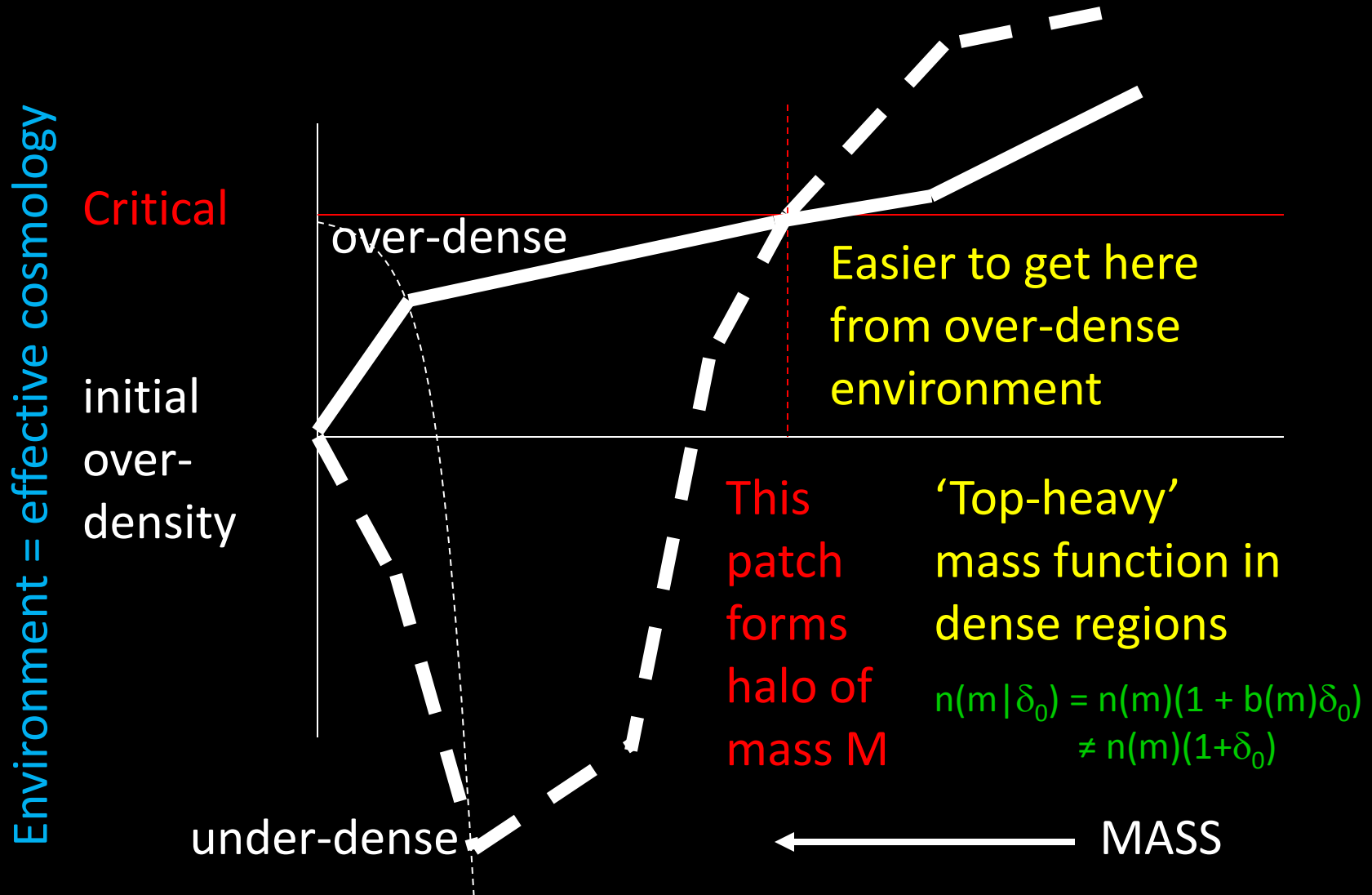
N.B. For any  $V$ , there is a curve  $\delta_0(M|V)$ .

# Moving barriers: The Nonlinear PDF

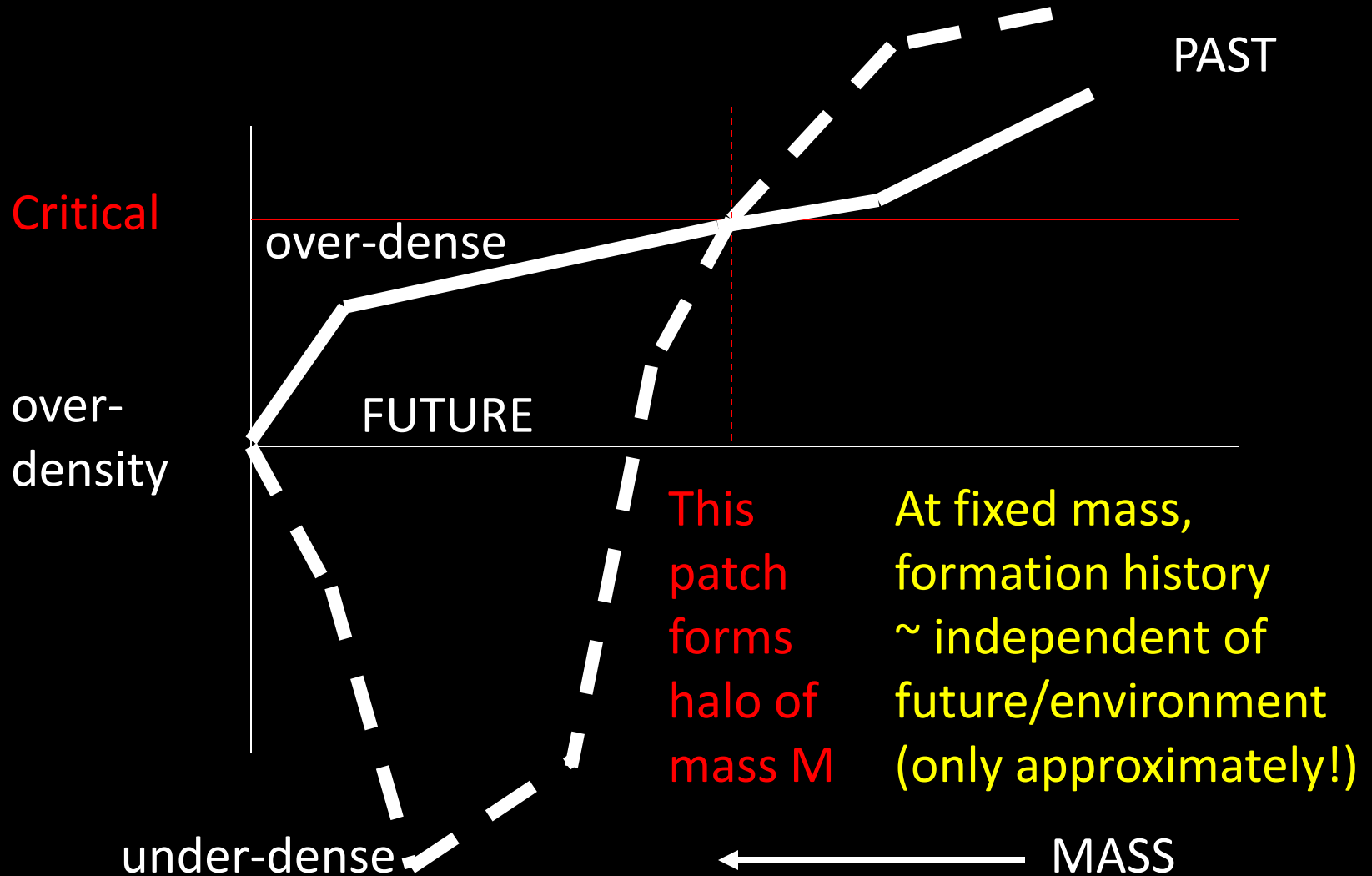




# Correlations with environment



# Correlations with environment



# Large scale clustering/bias (from the peak-background split)

$$1 + \delta_h(v | \delta_0, S_0) = f(v | \delta_0, S_0) / f(v) \\ = 1 + b_1(v) \delta_0 + \dots$$

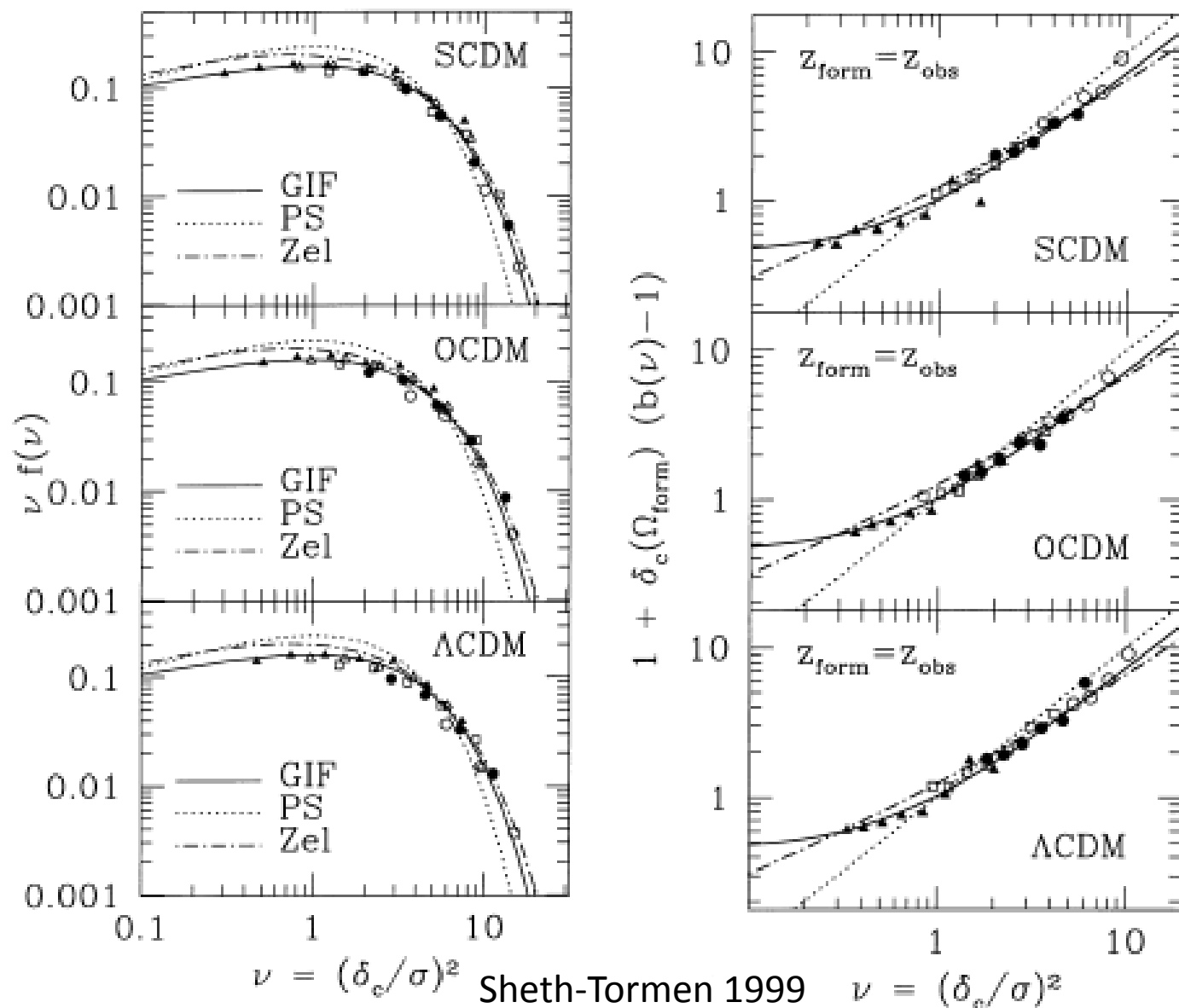
- $b(v)$  directly from (derivatives of)  $f(v)$  means halo abundances predict halo clustering
- $b(v)$  increases with  $v$ 
  - top-heavy mass function in dense regions:  
 $n(m | \delta_0) = n(m)(1 + b(m)\delta_0 + \dots) \neq n(m)(1 + \delta_0)$
  - massive halos (i.e. larger  $v$ ) more clustered:  
 $\langle \delta_h \delta_0 \rangle = b_1(v) \langle \delta_0^2 \rangle + \dots$



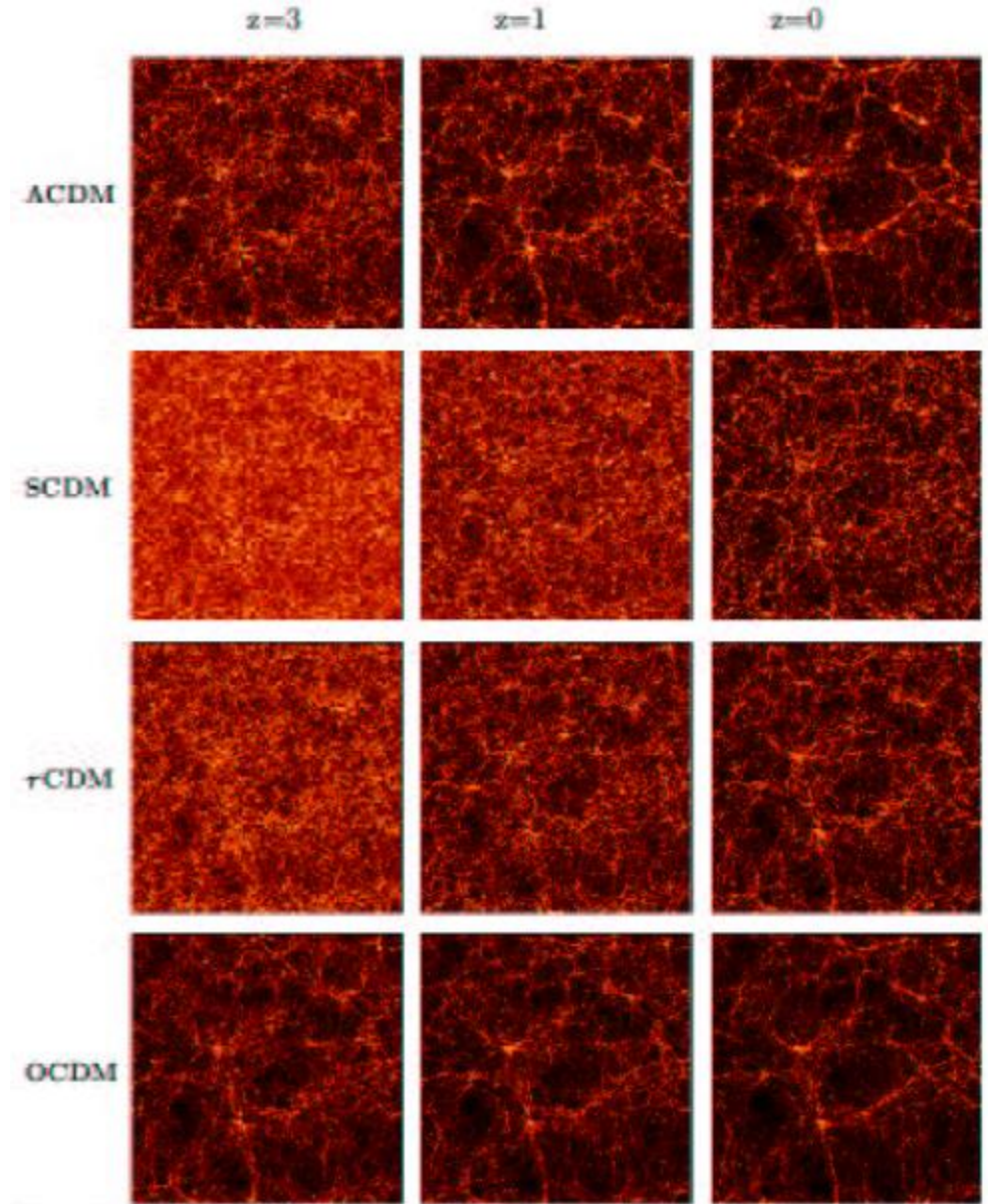
(Almost)  
universal  
mass  
function  
and halo  
bias

See Paranjape  
et al (2013) for  
recent progress  
in modeling this  
from first  
principles

See Castorina et  
al. (2014) for  $\nu$ 's



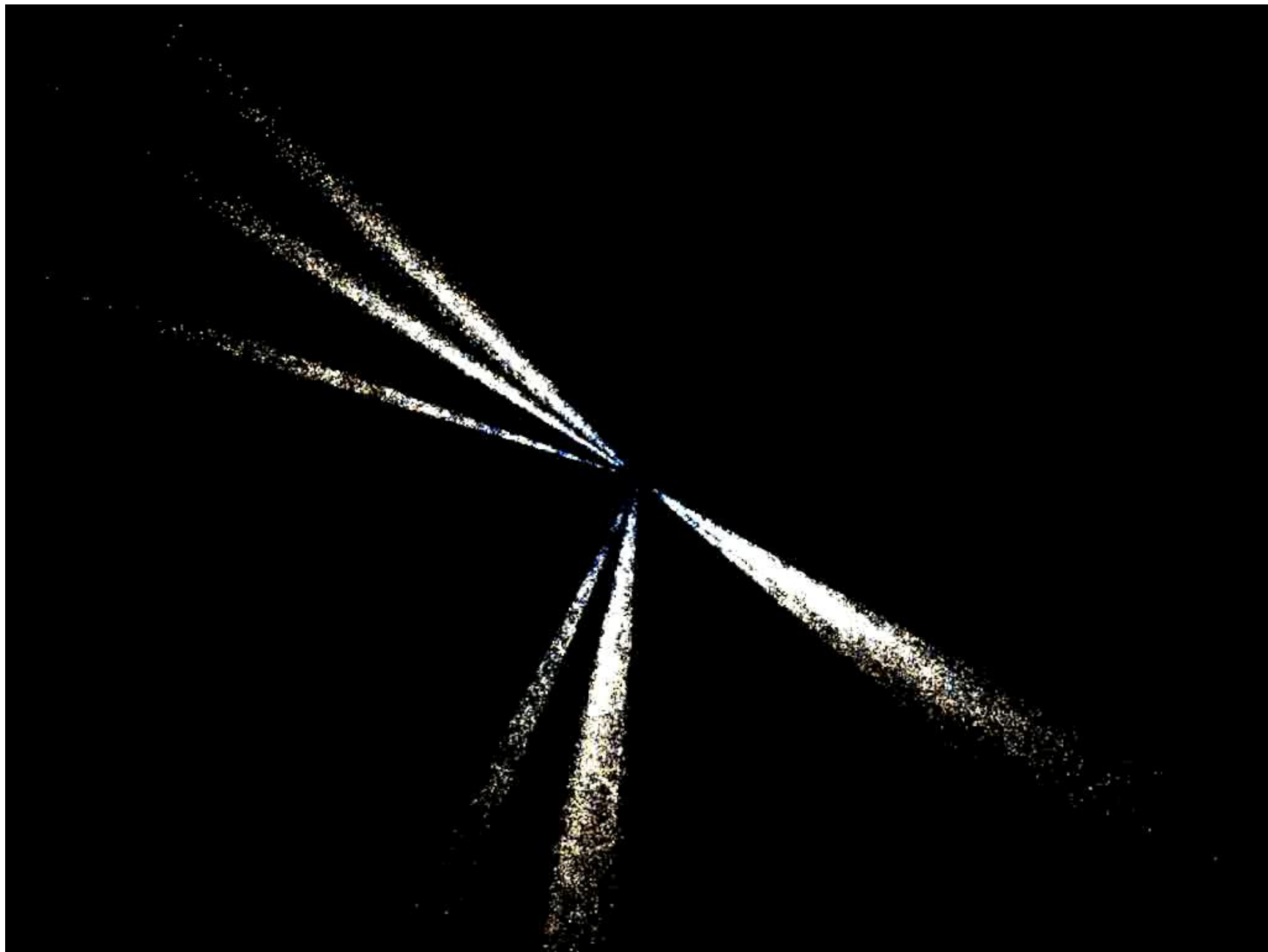
- Structure at a given time, and, more importantly, growth of structure, provides sharp constraints on models



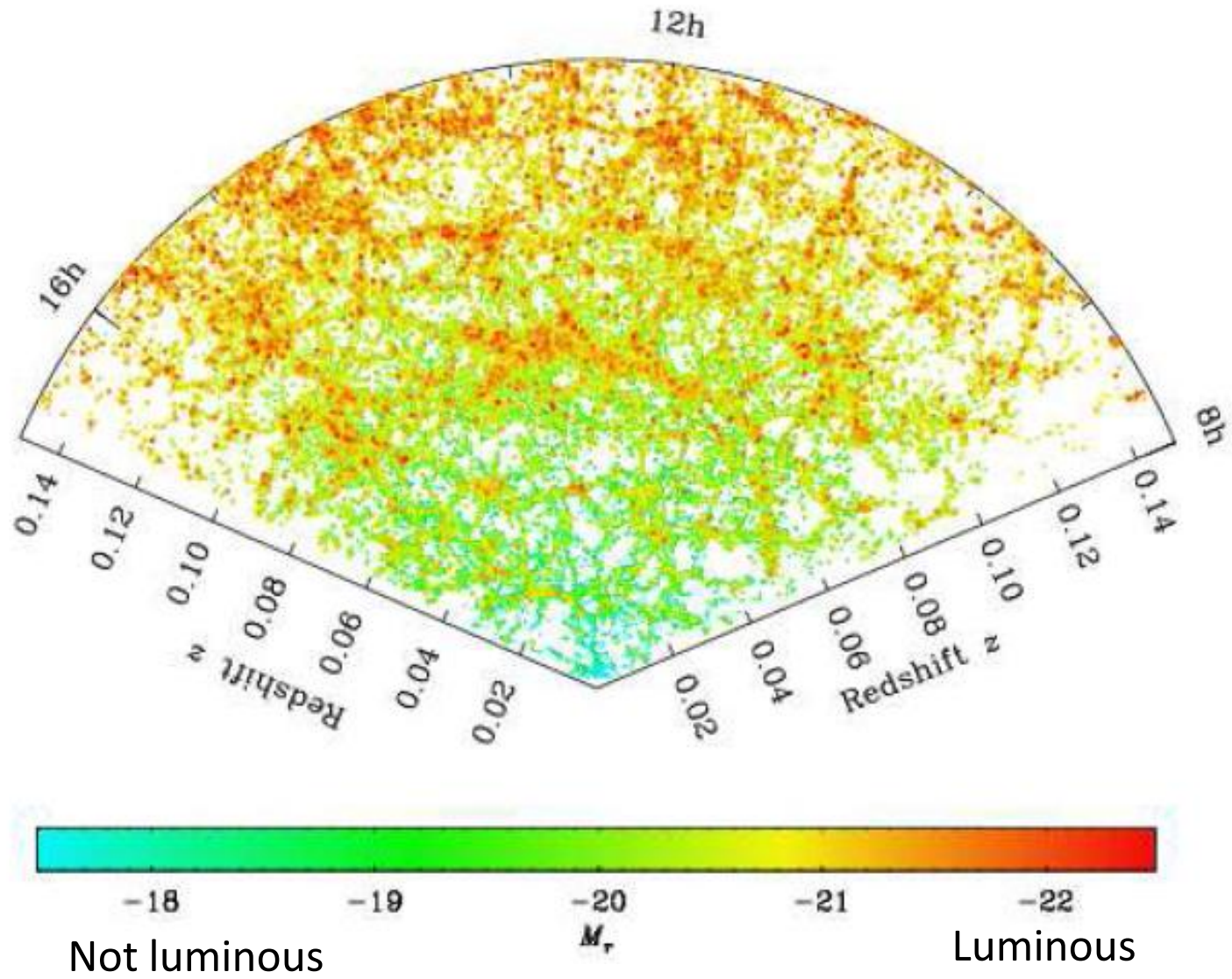
# Hierarchical clustering in GR



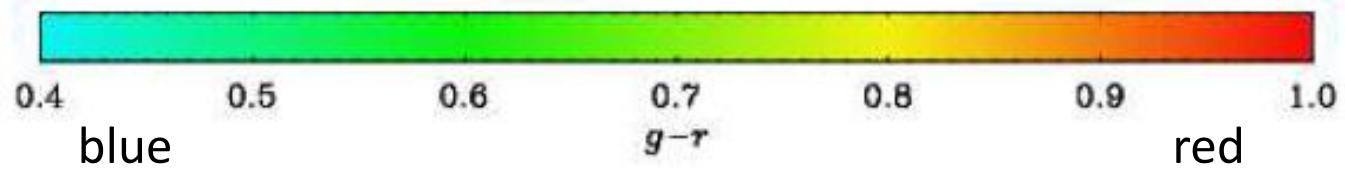
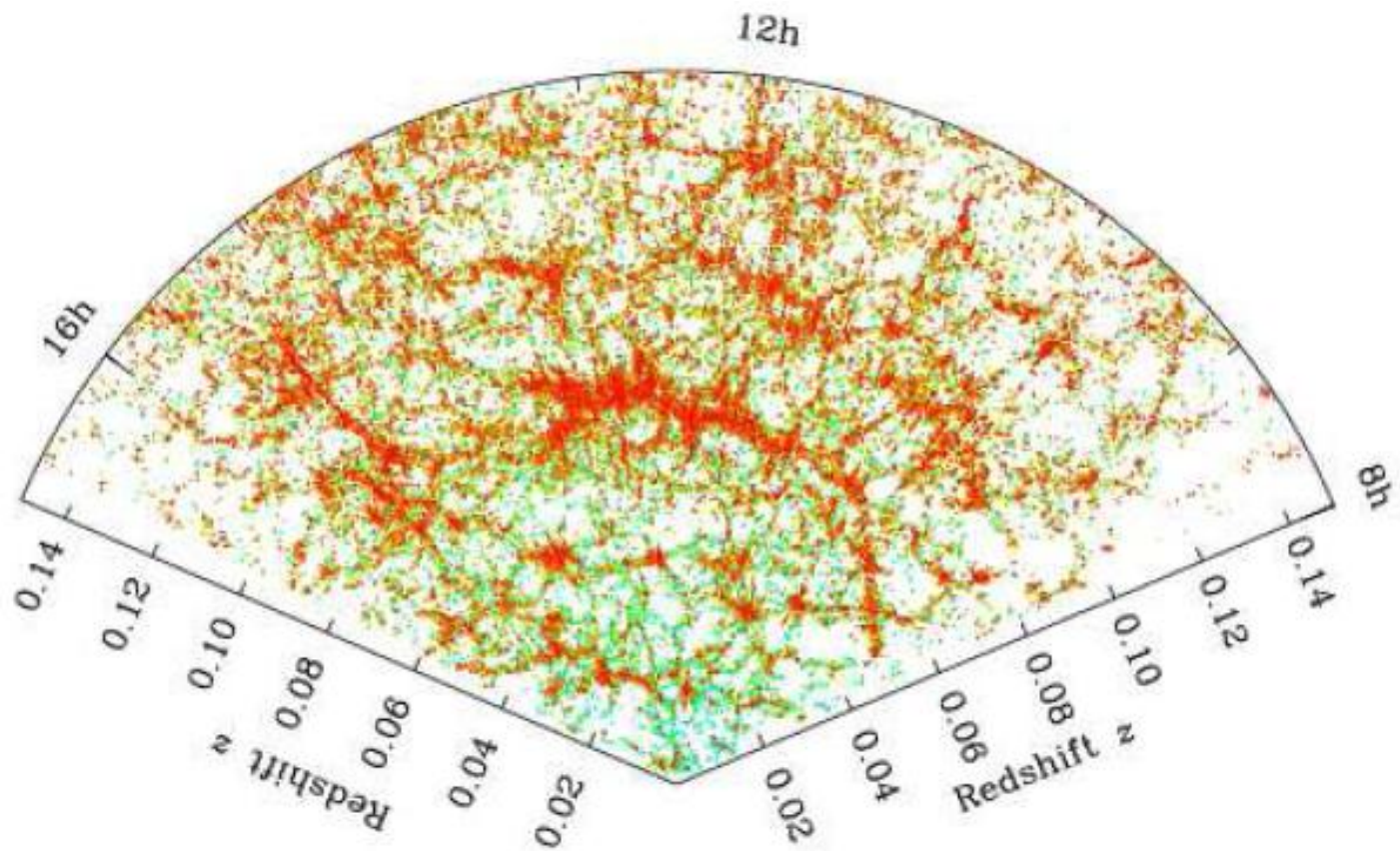
= the persistence of memory



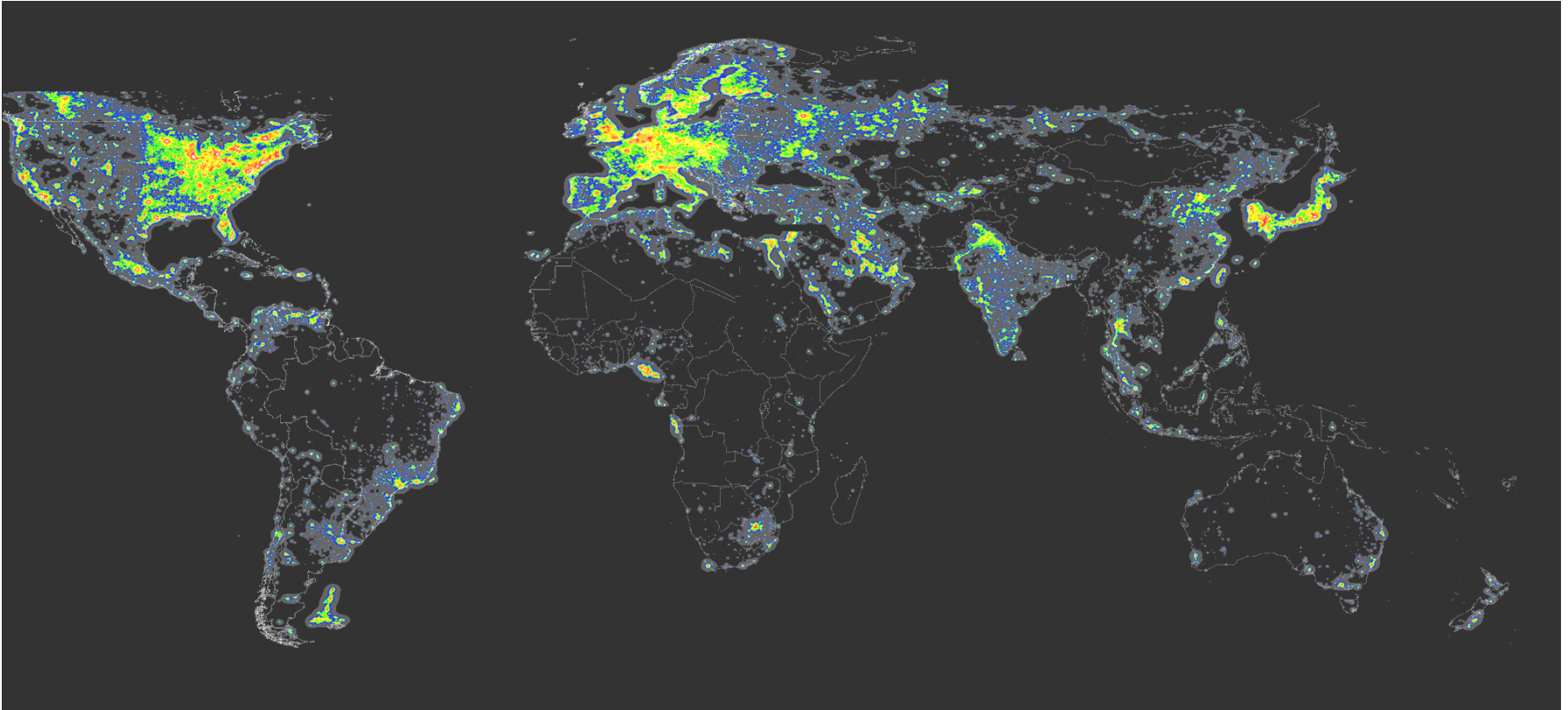




Zehavi et al. 2010 (SDSS)



# Complication: Light is a biased tracer



Not all galaxies are fair tracers of dark matter;  
To use galaxies as probes of underlying dark matter  
distribution, must understand 'bias'

You can observe a lot  
just by watching



How to describe different point processes which are all built from the same underlying density field?

## THE HALO MODEL

Review in Physics Reports (Cooray & Sheth 2002)

# A THEORY OF THE SPATIAL DISTRIBUTION OF GALAXIES\*

J. NEYMAN AND E. L. SCOTT

Statistical Laboratory, University of California

*Received February 18, 1952*

## ABSTRACT

A theory of the spatial distribution of galaxies is built, based on the following four main assumptions: (i) galaxies occur only in clusters; (ii) the number of galaxies varies from cluster to cluster, subject to a probabilistic law; (iii) the distribution of galaxies within a cluster is also subject to a probabilistic law; and (iv) the distribution of cluster centers in space is subject to a probabilistic law described as quasi-uniform. The main result obtained is the joint probability generating function  $G_{N_1, N_2}(t_1, t_2)$  of numbers  $N_1$  and  $N_2$  of galaxies visible on photographs from two arbitrarily placed regions  $\omega_1$  and  $\omega_2$ , taken with fixed limiting magnitudes  $m_1$  and  $m_2$ , respectively. The theory ignores the possibility of light-absorbing clouds. The function  $G_{N_1, N_2}(t_1, t_2)$  is expressed in terms of four functions left unspecified, which govern the details of the structure contemplated. Methods are indicated whereby approximations to these functions can be obtained and whereby the general validity of the hypotheses can be tested.

Center-satellite process requires knowledge of how

1) halo abundance;      2) halo clustering;      3) halo profiles;  
4) number of galaxies per halo;      all depend on halo mass (+ ...)

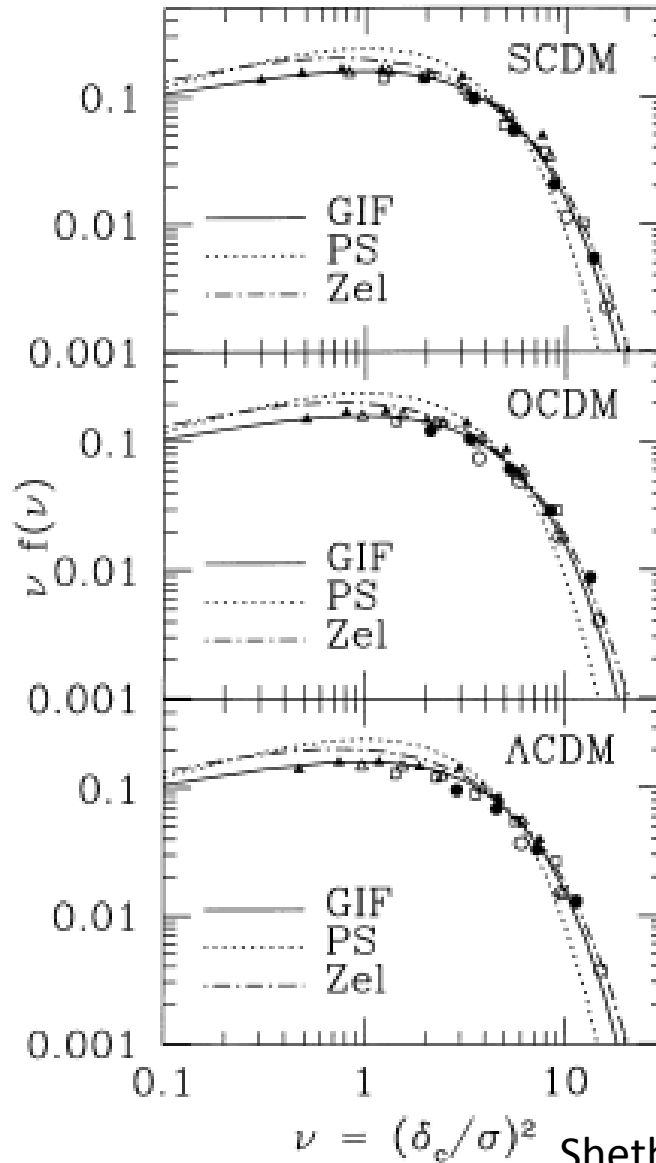
(Revived, then discarded in 1970s by Peebles, McClelland & Silk)

(Almost)  
universal  
mass function

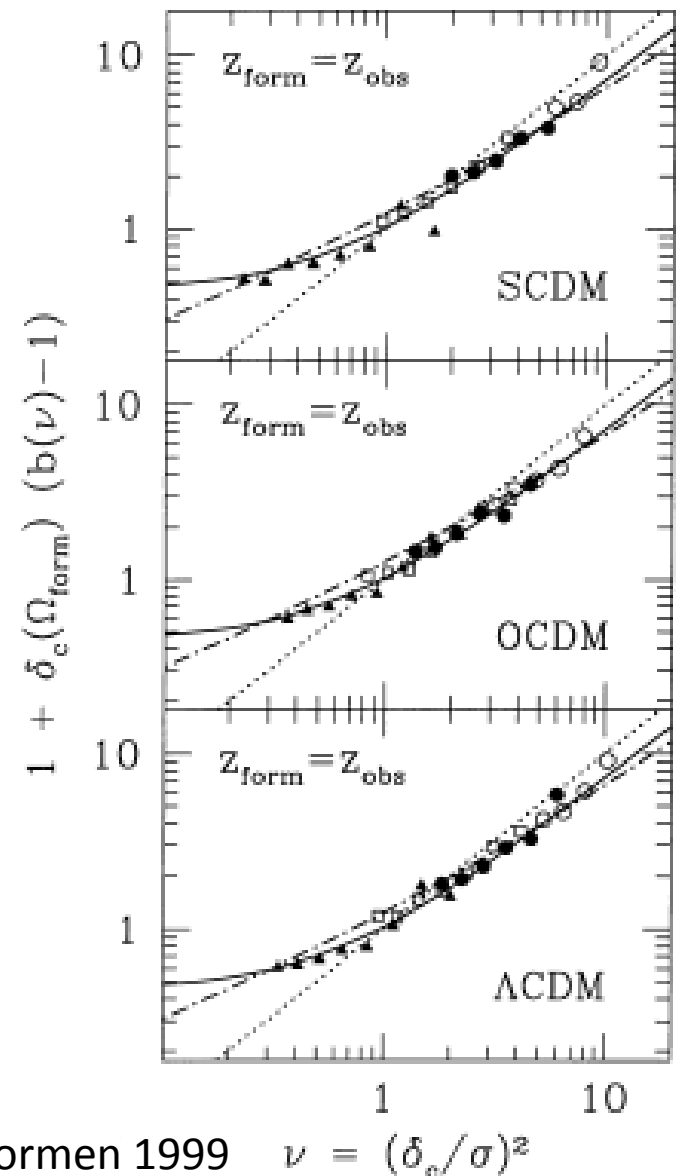
$(m/\rho) (dn/d\ln v) =$   
 $v f(v) = A [1 + (q v)^{-p}]$   
 $\quad \text{sqrt}(q v / 2\pi)$   
 $\quad \exp(-q v / 2)$   
 where all  $v = (\delta_c / \sigma)^2$   
 and A ensures  
 integral over all  $v$  is  
 unity

and halo bias

$$b(v) = 1 + d\ln f / d\delta_c$$



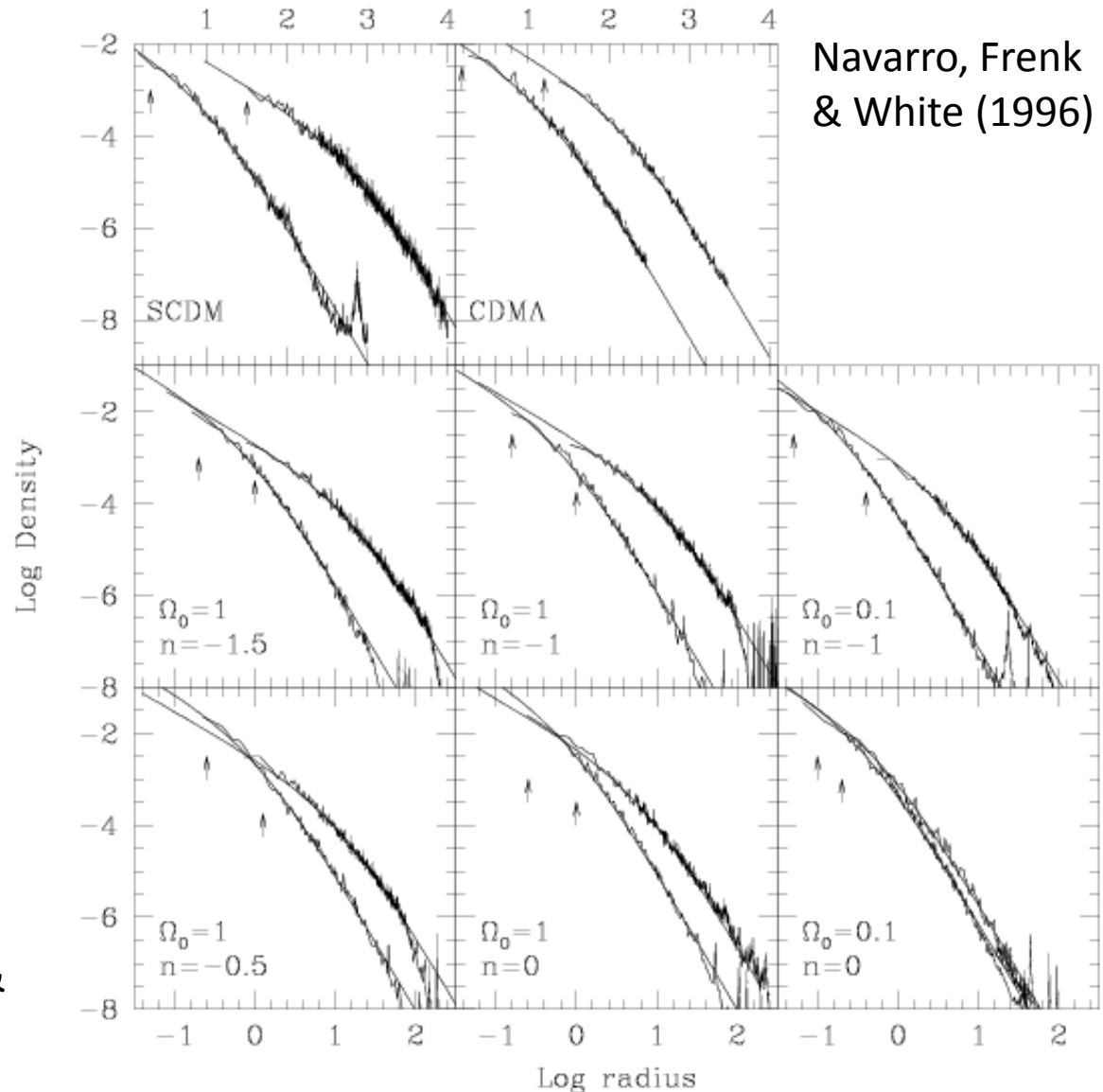
Sheth-Tormen 1999



# Universal Halo Profiles

$$\rho(r) = 4\rho_s/(r/r_s)/(1+ r/r_s)^2$$

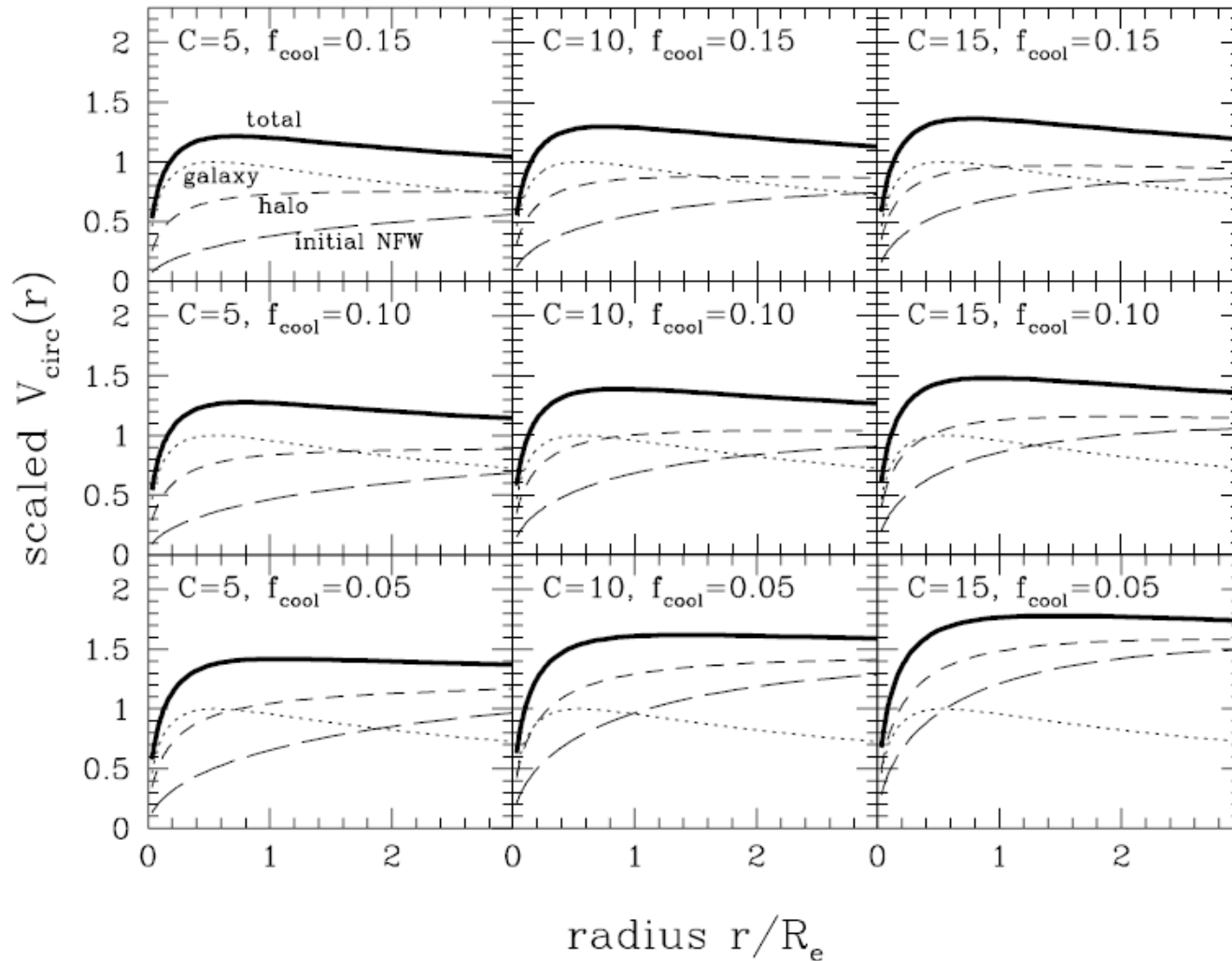
- Not quite isothermal
- Depend on halo mass, formation time
- Massive halos less concentrated (partially built-in from GRF initial conditions)
- Distribution of shapes (axis-ratios) known (Jing & Suto 2001)





# Baryonic effects on the profile:

## Adiabatic contraction



# Adiabatic contraction ...

$$r [M_g(<r) + M_{dm}(<r)] = r_i M_{g+dm}(<r_i)$$

- Dark matter initially within  $r_i$  and now within  $r$  is

$$M_{dm}(<r) = (1 - f_g) M_{tot}(<r_i)$$

- Circular velocity from

$$V_{circ}^2(r) = GM(<r)/r = (r_i/r)^2 GM_{g+dm}(<r_i)/r_i$$

$$V_{circ}(r) = (r_i/r) V_{circ}(r_i)$$

- In general, solve numerically. But, for (realistic) Hernquist galaxy  $M_g(<r) = M_g (r/s_g)^2/(1+r/s_g)^2$  result is analytic:

$$f_g r^3 + (r+s_g)^2 [(1-f_g) r - r_i] m_{g+dm}(r_i) = 0$$

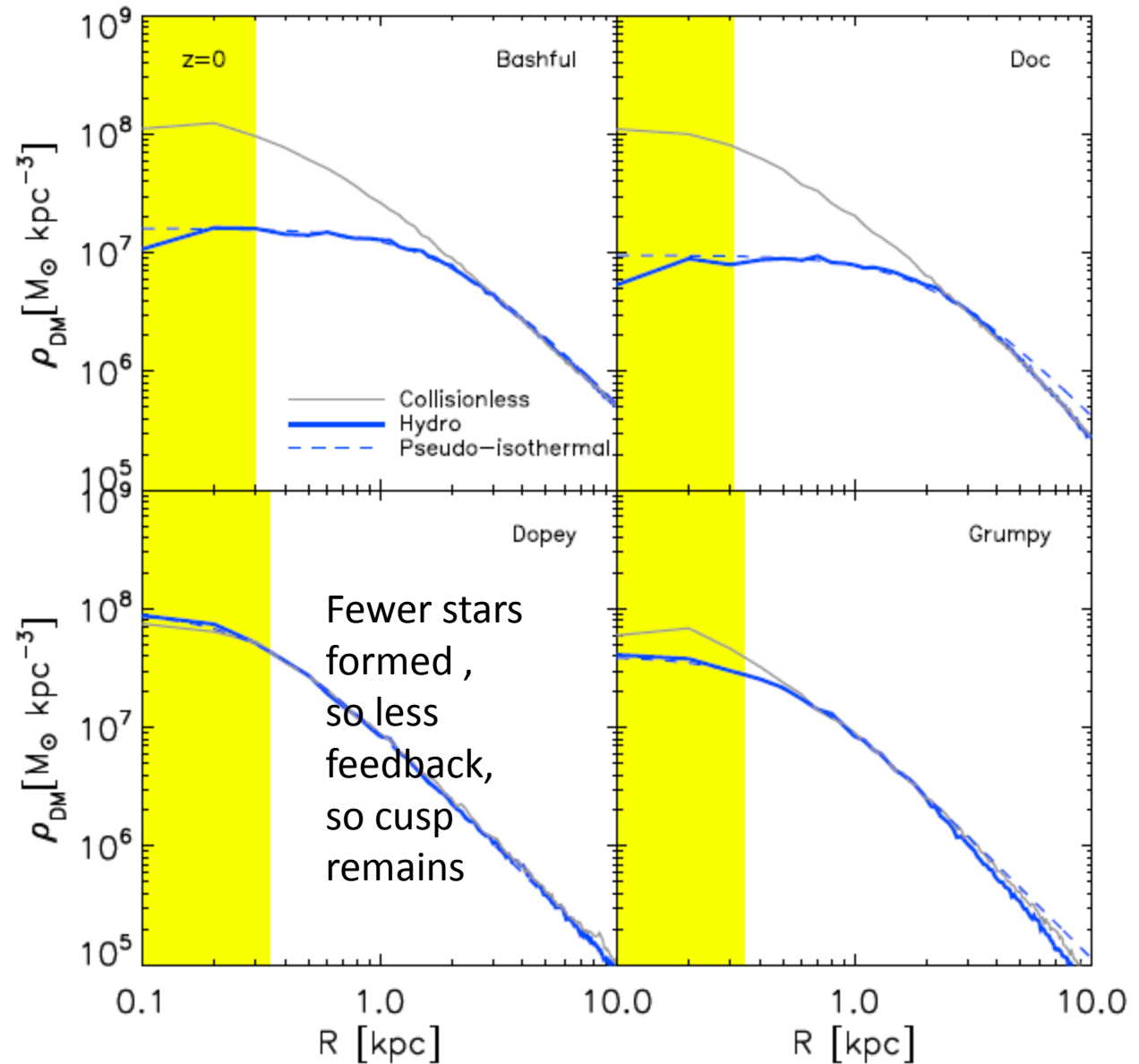
where  $f_g = M_g/M_{tot}$ . Get  $r$  by solving the cubic (Keeton 2001).

... increases circular velocities.

Inclusion of star formation feedback related effects can heat (expand) the gas, thus the dark matter as well: remove the cusp

Binding energy is  $M(GM/R) \sim M^{5/3}$   
so removal of cusp easier at low mass

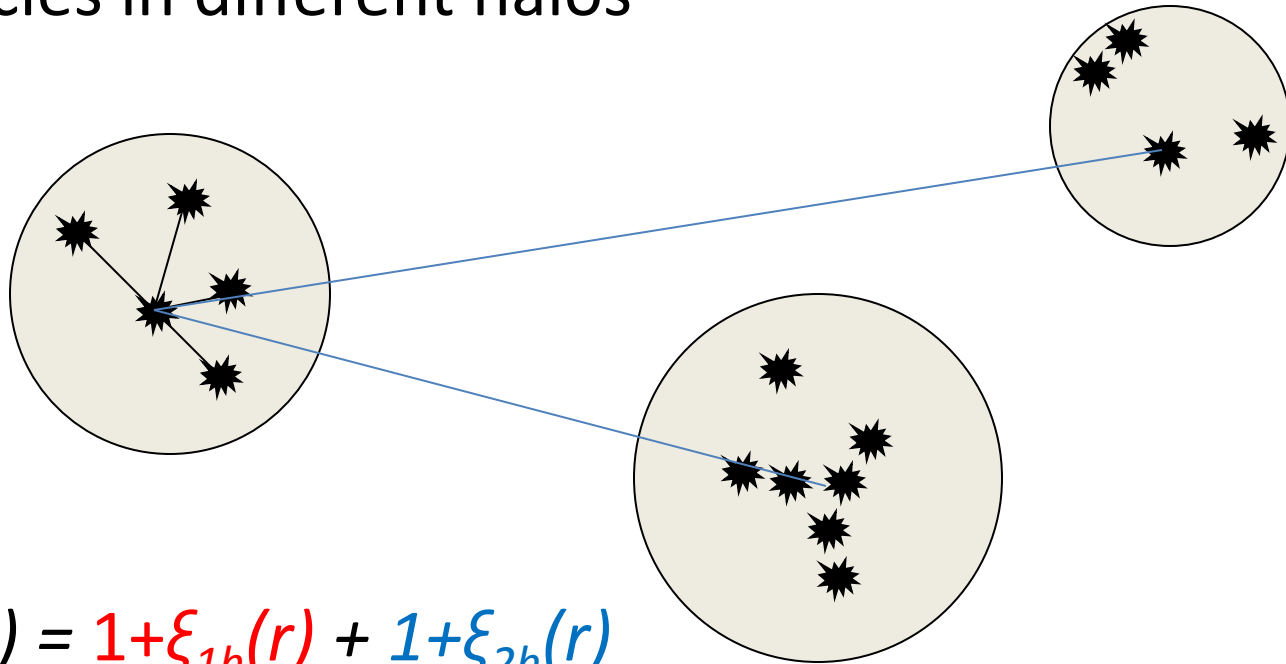
What remains has smaller  $V_{\text{circ}}$ , thus resolving the too-big-to-fail problem with no new physics



Madau et al. 2014

# The halo-model of clustering

- Two types of pairs: both particles in same halo, or particles in different halos



- $1+\xi(r) = 1+\xi_{1h}(r) + 1+\xi_{2h}(r)$
- All physics can be decomposed similarly: ‘nonlinear’ effects from within halo, ‘linear’ from outside



# The dark-matter correlation function

$$\xi_{dm}(r) = \xi_{1h}(r) + \xi_{2h}(r)$$

- $\xi_{1h}(r) \sim \int dm \, n(m) \, m^2 \, \xi_{dm}(r/m) / \rho^2$
- $n(m)$ : comoving number density of  $m$ -halos
- Comoving mass density:  $\rho = \int dm \, n(m) \, m$
- $\xi_{dm}(r/m)$ : fraction of total pairs,  $m^2$ , in an  $m$ -halo which have separation  $r$ ; depends on (convolution of) density profile within  $m$ -halos
- This term only matters on scales smaller than the virial radius of a typical  $M_*$  halo ( $\sim \text{Mpc}$ )
  - Need not know spatial distribution of halos!

$$\xi_{dm}(r) = \xi_{1h}(r) + \xi_{2h}(r)$$

- $\xi_{2h}(r) \approx \int dm_1 \frac{m_1 n(m_1)}{\rho} \int dm_2 \frac{m_2 n(m_2)}{\rho} \xi_{2h}(r|m_1, m_2)$
- Two-halo term dominates on large scales, where peak-background split estimate of halo clustering should be accurate:  $\delta_h \sim b(m) \delta_{dm}$
- $\xi_{2h}(r|m_1, m_2) \sim \langle \delta_h^2 \rangle \sim b(m_1) b(m_2) \langle \delta_{dm}^2 \rangle$
- $\xi_{2h}(r) \approx [\int dm m n(m) b(m) / \rho]^2 \xi_{dm}(r)$
- On large scales, linear theory is accurate:  
 $\xi_{dm}(r) \approx \xi_{Lin}(r)$  so  $\xi_{2h}(r) \approx b_{eff}^2 \xi_{Lin}(r)$

# Dark matter power spectrum

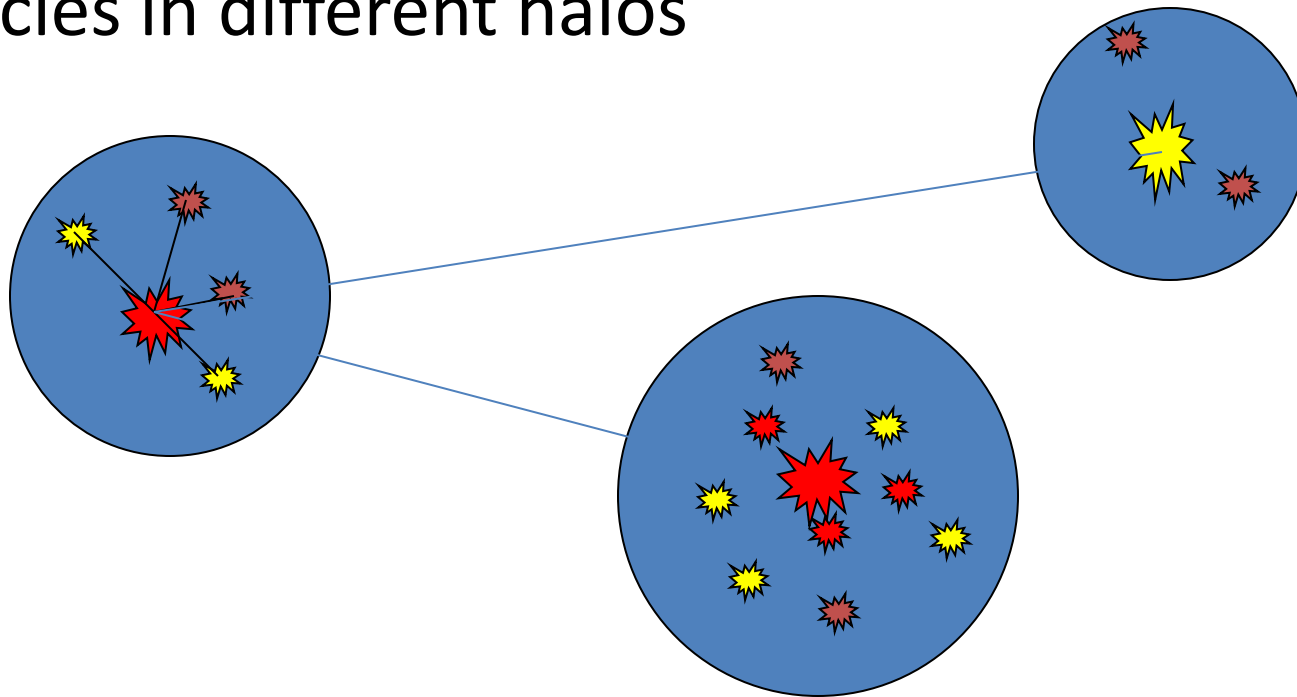
- Convolutions in real space are products in k-space, so  $P(k)$  is easier than  $\xi_{1h}(r)$

$$P(k) = P_{1h}(k) + P_{2h}(k)$$

- $P_{1h}(k) = \int dm n(m) m^2 |u_{dm}(k|m)|^2 / \rho^2$
- $P_{2h}(k) \approx [\int dm n(m) b(m) m u_{dm}(k|m) / \rho]^2 P_{dm}(k)$

# The halo-model of galaxy clustering

- Two types of particles: central + 'satellite'
- Two types of pairs: both particles in same halo, or particles in different halos



- $1+\xi_{\text{obs}}(r) = 1+\xi_{1h}(r) + 1+\xi_{2h}(r)$   
 $1+\xi_{1h}(r) = 1+\xi_{\text{cs}}(r) + 1+\xi_{\text{ss}}(r)$

# The halo-model of galaxy clustering

- Write as sum of two components:
  - $1 + \xi_{1\text{gal}}(r) = \int dm \, n(m) \, g_2(m) \, \xi_{\text{dm}}(m|r) / \rho_{\text{gal}}^2$
  - $\xi_{2\text{gal}}(r) \approx [\int dm \, n(m) \, g_1(m) \, b(m) / \rho_{\text{gal}}]^2 \xi_{\text{dm}}(r)$
  - $\rho_{\text{gal}} = \int dm \, n(m) \, g_1(m)$ : number density of galaxies
  - $\xi_{\text{dm}}(m|r)$ : fraction of pairs in  $m$ -halos at separation  $r$
- Think of mean number of galaxies,  $g_1(m)$ , as a weight applied to each dark matter halo
  - Galaxies ‘biased’ if  $g_1(m)$  not proportional to  $m$ , ...,  $g_n(m)$  not proportional to  $m^n$  (Jing, Mo & Boerner 1998; Benson et al. 2000; Peacock & Smith 2000; Seljak 2000; Scoccimarro et al. 2001)
  - Central + Poisson satellites model works well
- Similarly,  $Y_{\text{SZ}}$  or  $T_x$  are just a weight applied to halos, so same formalism can model cluster clustering



# The halo-model of galaxy clustering

- Write as sum of two components:
  - $1 + \xi_{1\text{gal}}(r) = \int dm \, n(m) \, g_2(m) \, \xi_{\text{dm}}(m|r) / \rho_{\text{gal}}^2$
  - $\xi_{2\text{gal}}(r) \approx [\int dm \, n(m) \, g_1(m) \, b(m) / \rho_{\text{gal}}]^2 \xi_{\text{dm}}(r)$
  - $\rho_{\text{gal}} = \int dm \, n(m) \, g_1(m)$ : number density of galaxies
  - $\xi_{\text{dm}}(m|r)$ : fraction of pairs in  $m$ -halos at separation  $r$
- Handle ‘assembly bias’ easily by treating  $m$  as vector ( $m, c, \text{spin}, \dots$ )
  - See Musso et al. (2012, 2014), Dalal et al. (2008)
  - Statements that halo model cannot treat this bias are based on common but NOT essential assumption that  $m$  = halo mass only

# Power spectrum

- Convolutions in real space are products in k-space, so  $P(k)$  is easier than  $\xi(r)$ :

$$P(k) = P_{1h}(k) + P_{2h}(k)$$

- $P_{1h}(k) = \int dm \, n(m) \, g_2(m) \, |u_{dm}(k|m)|^2 / \rho^2$
- $P_{2h}(k) \approx [\int dm \, n(m) \, b(m) \, g_1(m) \, u_{dm}(k|m) / \rho]^2 \, P_{dm}(k)$

# Bells and whistles

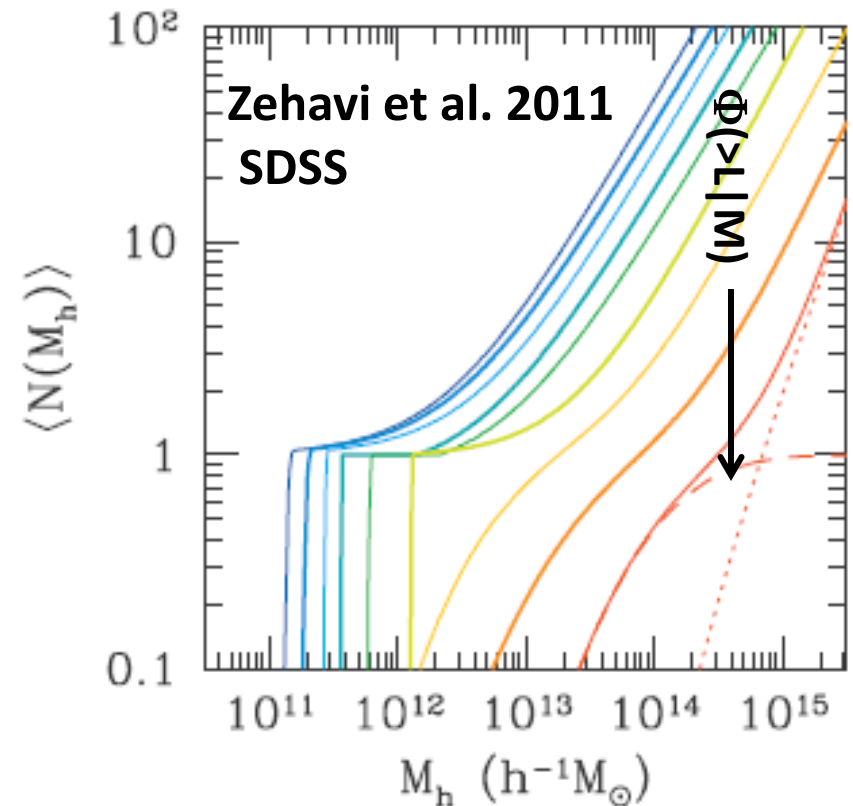
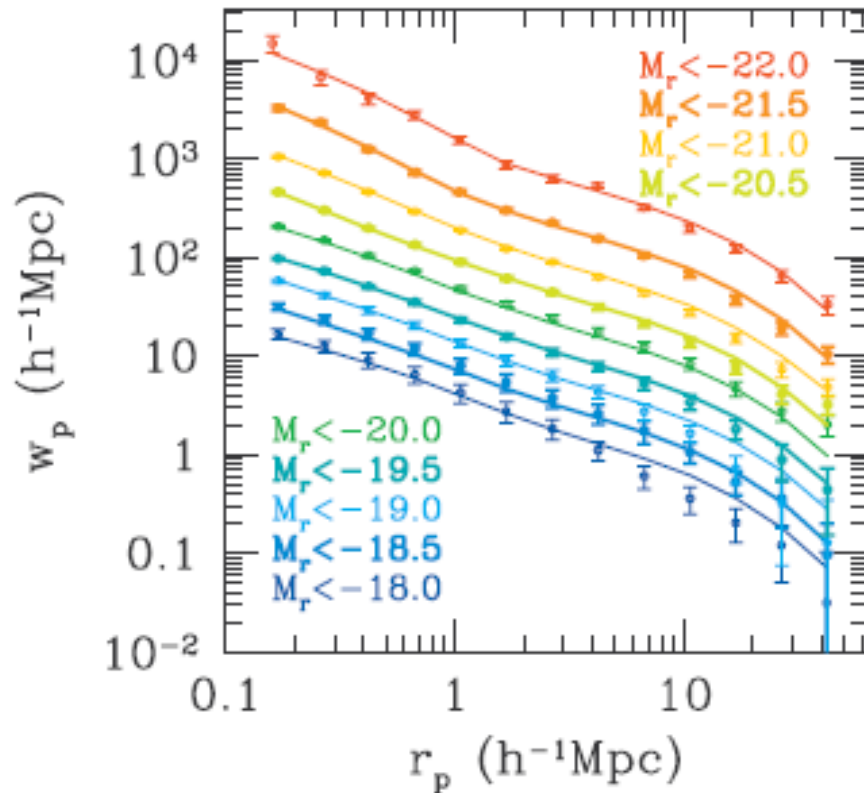
## (which matter for CDM→WDM)

- Mass-concentration and scatter
  - Different profiles for red vs blue
- Distribution of halo shapes
  - Correlation of shapes with surrounding large scale structure
  - Projection effects matter for conc-m relation!
- Substructure = galaxies? Correlations with concentration/formation, time/environment
  - Correlation of substructure with large scale structure

# Halo Model: HOD, CLF, SHAM

- Goal is to infer  $p(N|m)$  from measurements of abundance and clustering
  - Abundance constrains  $\langle N|m \rangle = g_1(m)$
  - 1-halo term of n-pt clustering constrains  $g_n(m)$
- HOD uses abundance and 2pt statistics to constrain  $p(N|m)$  from different samples (Zehavi et al. 2011; Skibba et al. 2014)
- CLF now does too, to constrain  $\phi(L|m)$  (Lu et al. 2014)
- Since  $\langle N(>L)|m \rangle = \phi(>L|m)$ , HOD~CLF but with different systematics
- SHAM uses abundance only, but gets 2pt stats quite well anyway (Moster et al. 2013)
  - Problematic for color selected samples

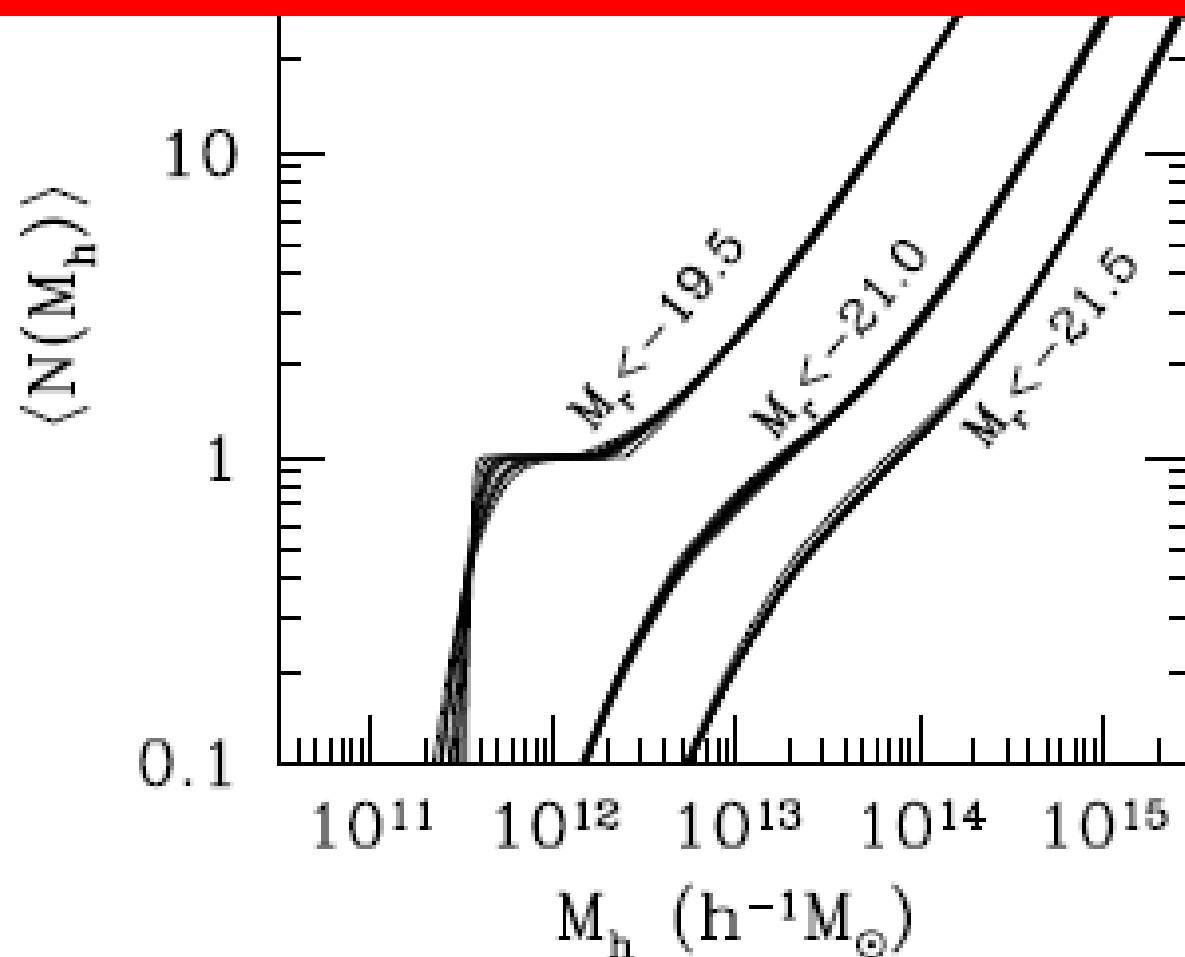
# Luminosity dependence of clustering



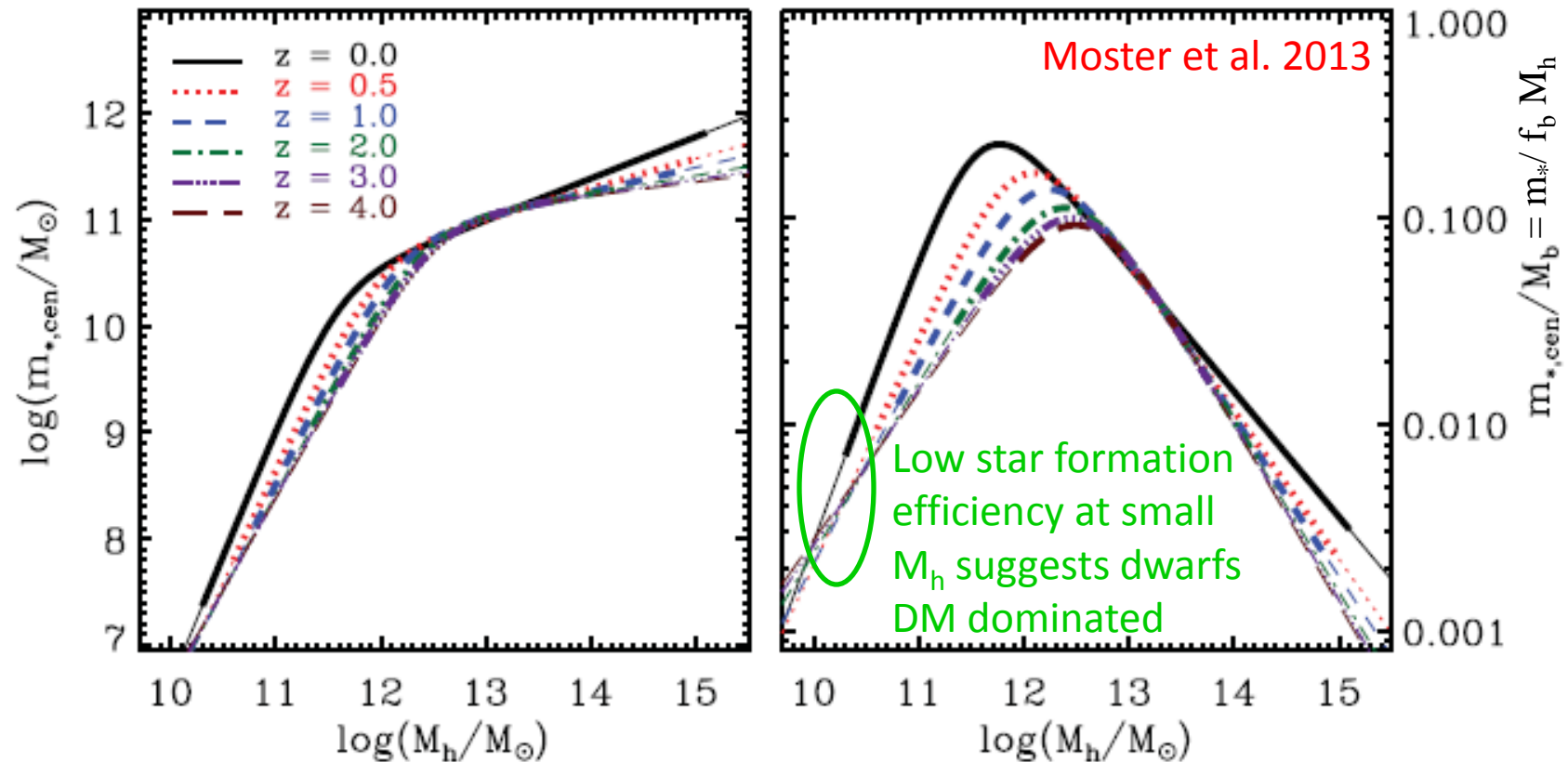
$$\langle N_{\text{gal}} | m \rangle = f_{\text{cen}}(m) [1 + \langle N_{\text{sat}} | m \rangle]$$



$$\langle N(M_h) \rangle = \frac{1}{2} \left[ 1 + \operatorname{erf} \left( \frac{\log M_h - \log M_{\min}}{\sigma_{\log M}} \right) \right] \left[ 1 + \left( \frac{M_h - M_0}{M'_1} \right)^\alpha \right], \quad (6)$$

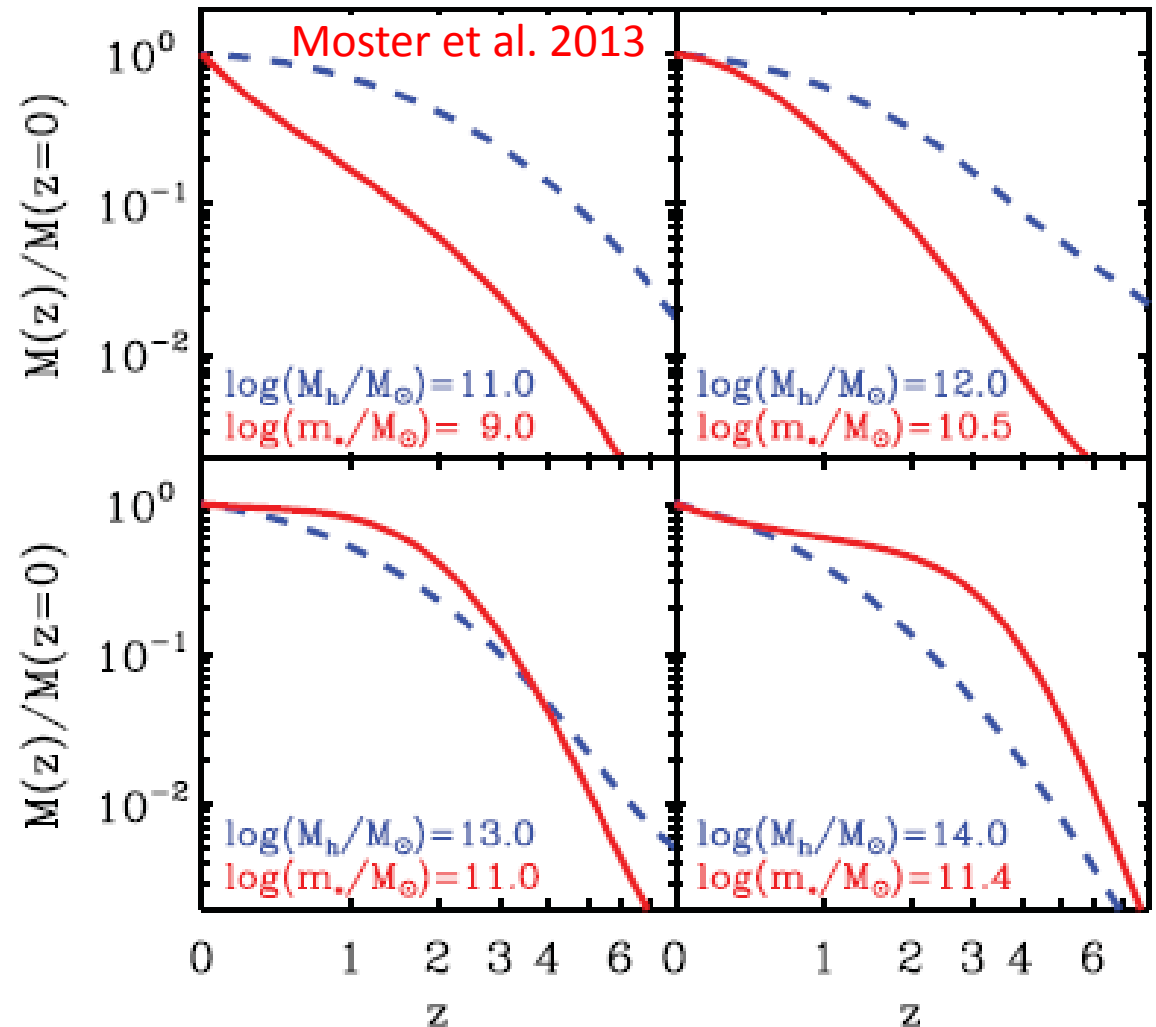


From  $\phi(L|M)$  or  $\phi(M^*|M)$  can determine  $\langle M^*|M \rangle$ ; i.e. star formation efficiency as function of halo mass



Knowing  $\langle M_*|M_h \rangle$  at each  $z$  yields estimates of  $\text{SFR}(M_h, z)$  for the population (i.e., not object by object)

- Knowing  $M_*$ - $M_h$  at each  $z$  yields  $M_*(z)$  given  $M_*(0)$  and  $M_h(0)$
- Since  $M_h(z)$  also known, can compare growth in situ vs mergers
- Hence, can deduce  $\text{SFR}(M_h, z)$  for the population (but not object by object)
- Clustering also predicted - OK



This is a very active field:

This is a very active field:

Nobody goes there anymore –  
it's too crowded



# The other half of phase-space: Velocities

Just as statistics can be split into  
two regimes, so too can the  
physics: linear + nonlinear

# 'Infall' velocities from spherical model

$$(R_{\text{initial}}/R_t)^3 = \text{Mass}/(\rho_{\text{com}} \text{Volume})$$
$$= 1 + \delta \approx (1 - \delta_t/\delta_{\text{sc}})^{-\delta_{\text{sc}}}$$

$$R(t)/R_{\text{initial}} \approx (1 - D(t) \delta_{\text{initial}}/\delta_{\text{sc}})^{\delta_{\text{sc}}/3}$$

Now use  $v(t) = dR(t)/dt$  so

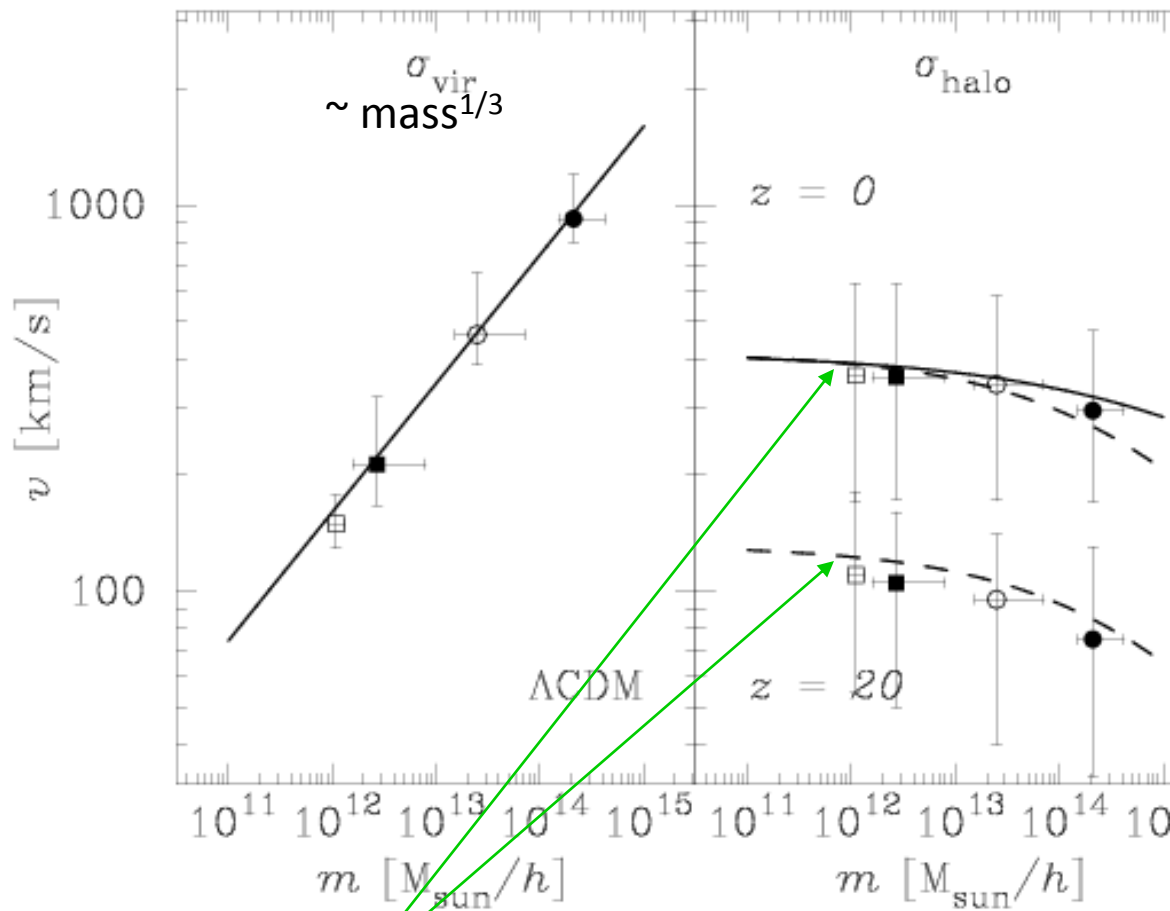
$$v(t)/HR = (d \ln R / dt) / (d \ln a / dt)$$
$$\approx (d \ln D / d \ln a) D(t) \delta_{\text{initial}} / 3$$
$$\approx \Omega^{0.56} D(t) \delta_{\text{initial}} / 3$$

# Non-Maxwellian Velocities?

- $\mathbf{v} = \mathbf{v}_{vir} + \mathbf{v}_{halo}$
- Maxwellian/Gaussian velocity within halo  
(dispersion depends on parent halo mass)  
+ Gaussian velocity of parent halo (from linear theory  $\approx$  independent of  $m$ )
- Hence, at fixed  $m$ , distribution of  $\mathbf{v}$  is convolution of two Gaussians, i.e.,  
 $p(\mathbf{v}/m)$  is Gaussian, with dispersion

$$\sigma_{vir}^2(m) + \sigma_{Lin}^2 = (m/m_*)^{2/3} \sigma_{vir}^2(m_*) + \sigma_{Lin}^2$$

# Two contributions to velocities



- Virial motions (i.e., nonlinear theory terms) dominate for particles in massive halos
- Halo motions (linear theory) dominate for particles in low mass halos

Growth rate of halo motions  $\sim$  consistent with linear theory

# Exponential tails are generic

- $p(v) = \int dm \, m n(m) G(v|m)$

$$F(t) = \int dv \, e^{ivt} p(v) = \int dm \, n(m) m e^{-t^2 \sigma_{\text{vir}}^2(m)/2} e^{-t^2 \sigma_{\text{Lin}}^2/2}$$

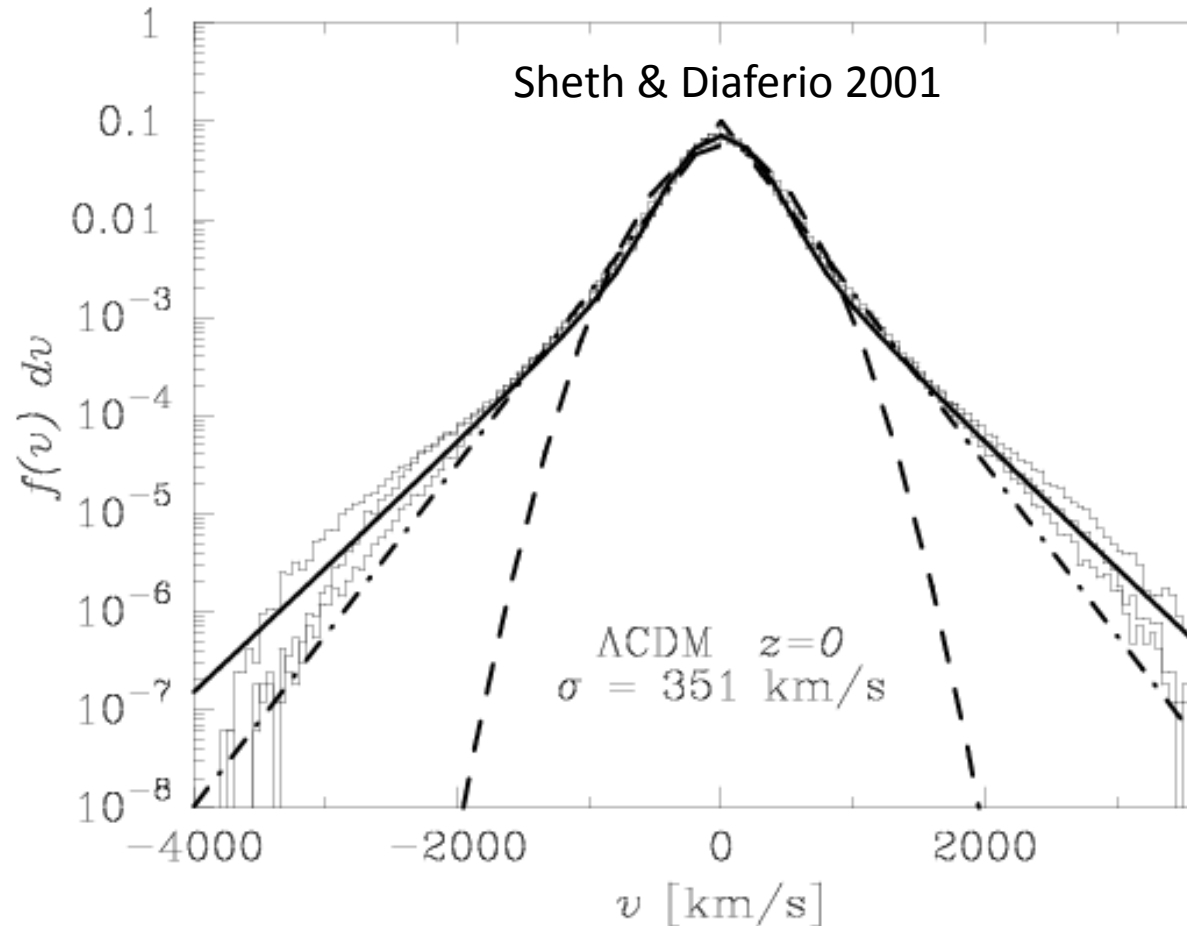
- For  $P(k) \sim k^{-1}$ , mass function  $n(m) \sim$  power-law times  $\exp[-(m/m_*)^{2/3}/2]$ , so integral is:

$$F(t) = e^{-t^2 \sigma_{\text{Lin}}^2/2} [1 + t^2 \sigma_{\text{vir}}^2(m_*)]^{-1/2}$$

- Fourier transform is product of Gaussian and FT of  $K_0$  Bessel function, so  $p(v)$  is convolution of  $G(v)$  with  $K_0(v)$
- Since  $\sigma_{\text{vir}}(m_*) \sim \sigma_{\text{Lin}}$ ,  $p(v) \sim$  Gaussian at  $|v| < \sigma_{\text{Lin}}$  but exponential-like tails extend to large  $v$

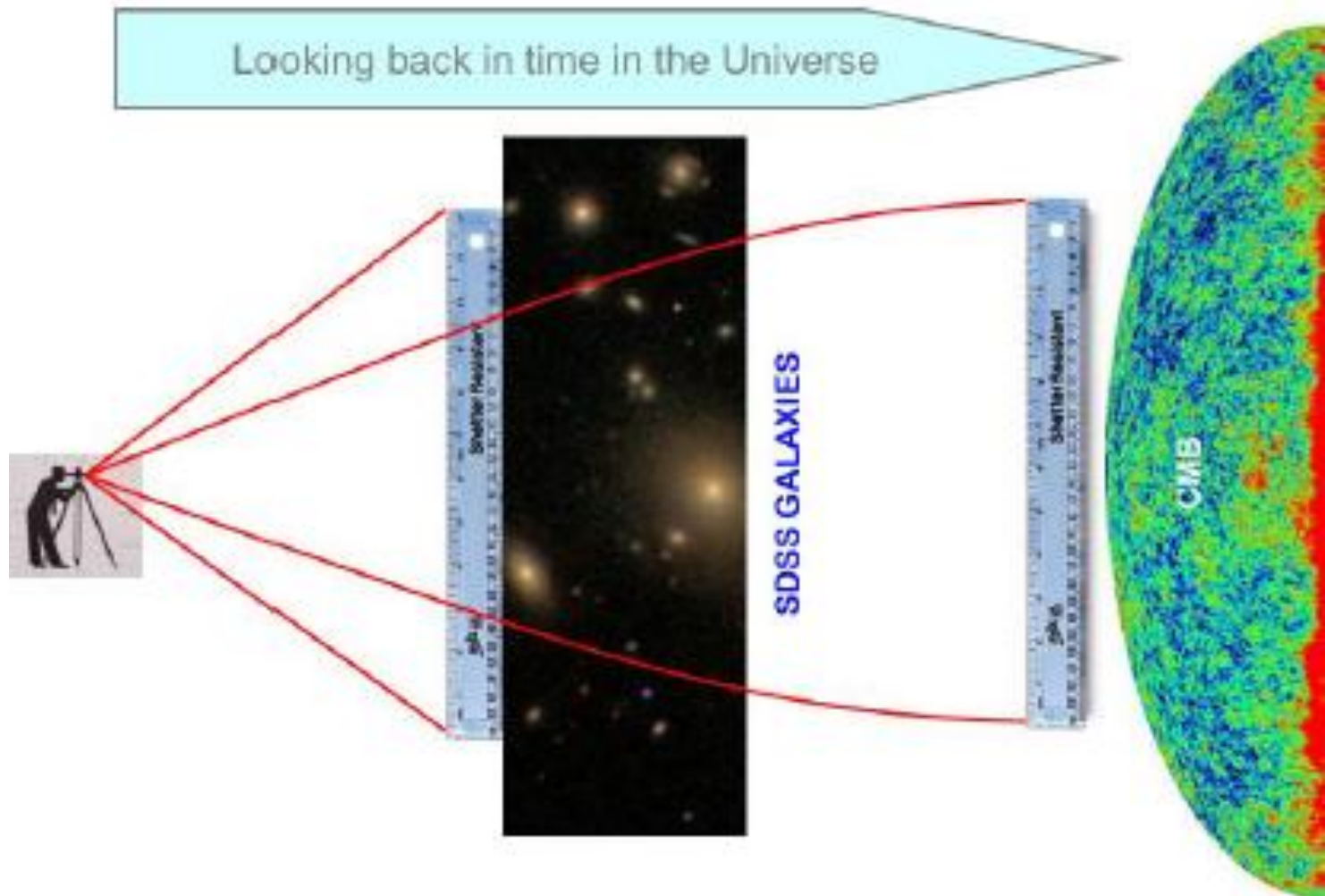


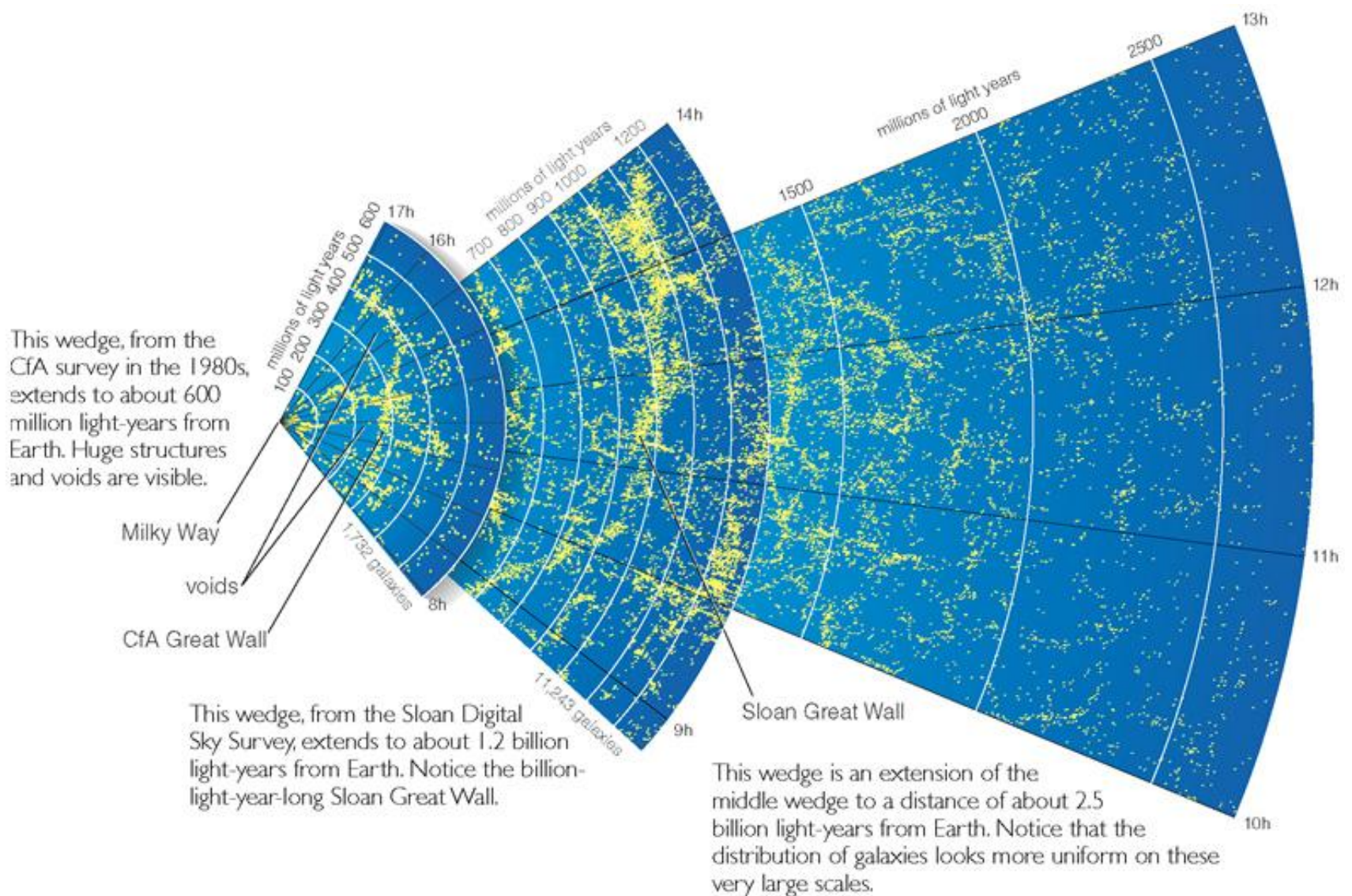
# Comparison with simulations



Gaussian core with exponential tails as expected

# Baryon Oscillations in the Galaxy Distribution



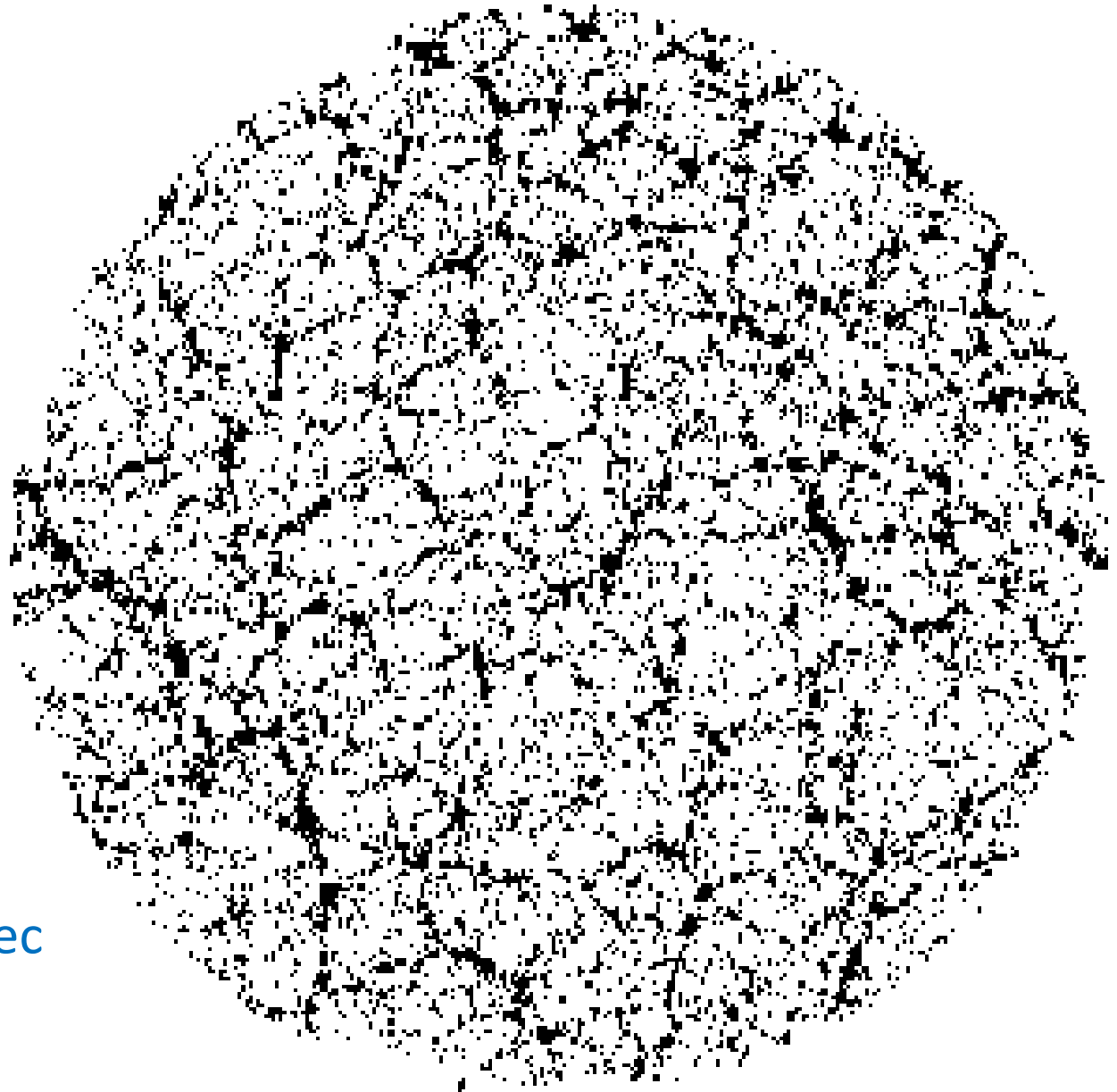


Structures in galaxy maps look very similar to the ones found in models in which dark matter is WIMPs

0.00

Redshift  
space  
distortions:  
peculiar  
velocities  
driven by  
gravity

$$cz_{\text{obs}} = Hd + v_{\text{pec}}$$

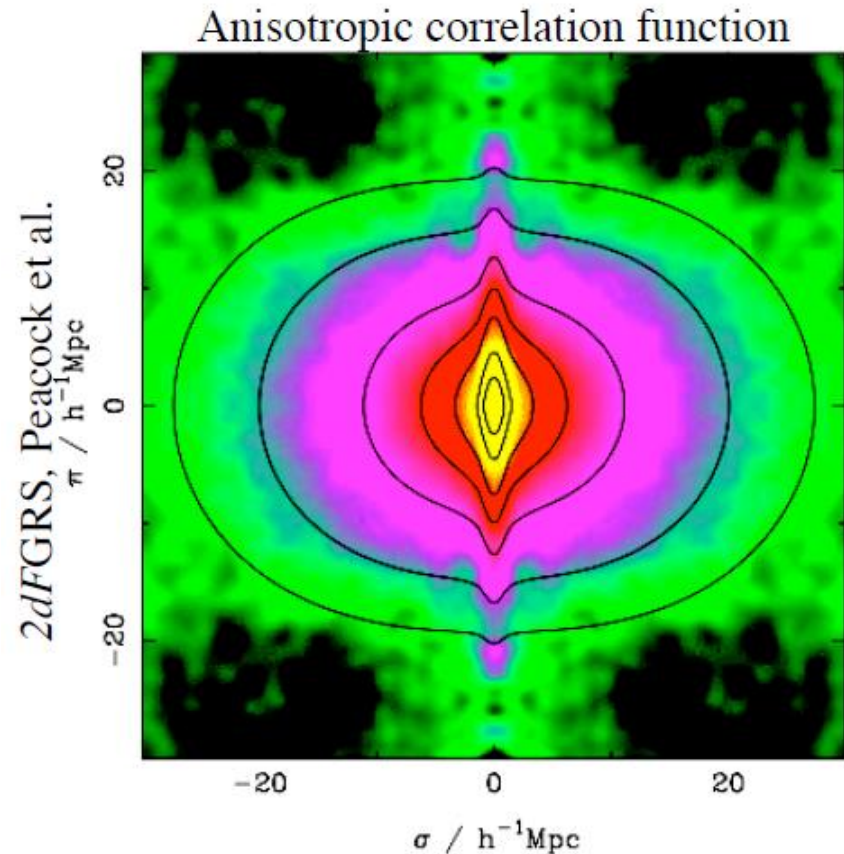
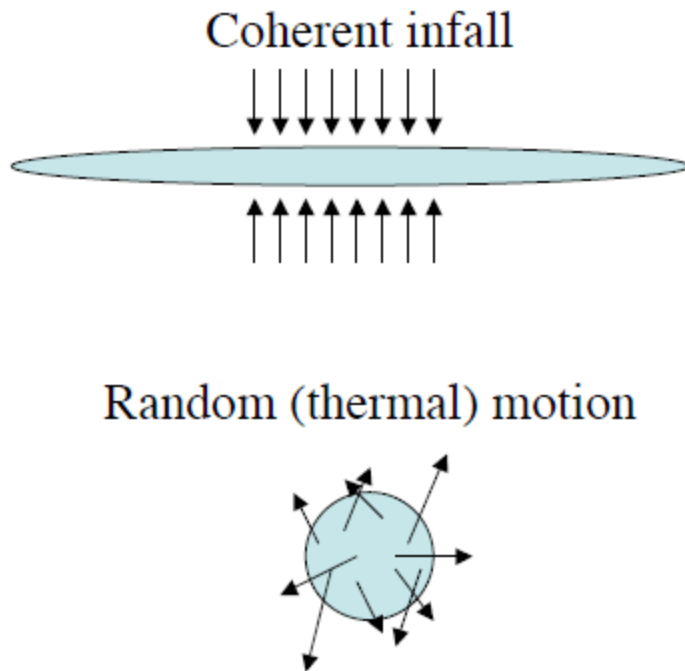


# Halos and Fingers-of-God

- Virial equilibrium:
- $V^2 = GM/r = GM/(3M/4\pi 200\rho)^{1/3}$
- Since halos have same density, massive halos have larger random internal velocities:  $V^2 \sim M^{2/3}$
- $V^2 = GM/r = (G/H^2) (M/r^3) (Hr)^2$   
 $= (8\pi G/3H^2) (3M/4\pi r^3) (Hr)^2/2$   
 $= 200 \rho/\rho_c (Hr)^2/2 = \Omega (10 Hr)^2$
- Halos should appear ~ten times longer along line of sight than perpendicular to it: 'Fingers-of-God'
- Think of  $V^2$  as Temperature; then Pressure  $\sim V^2\rho$



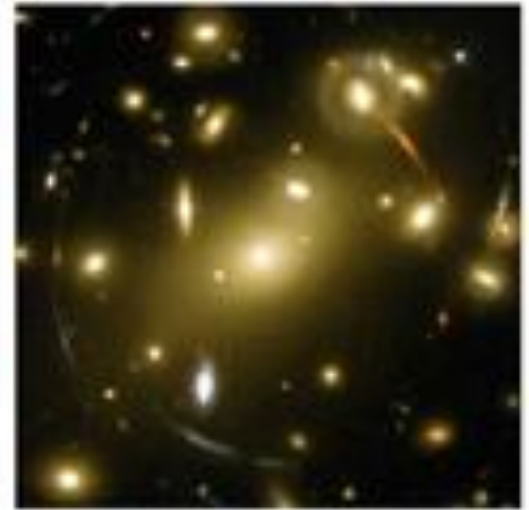
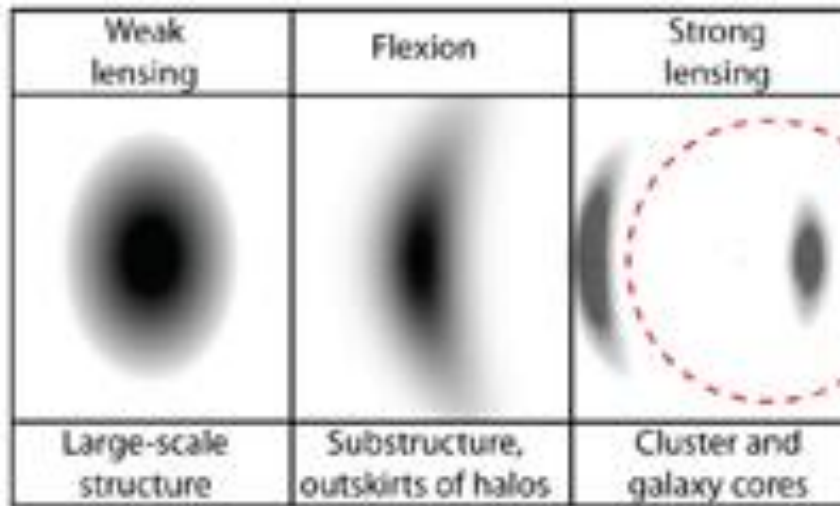
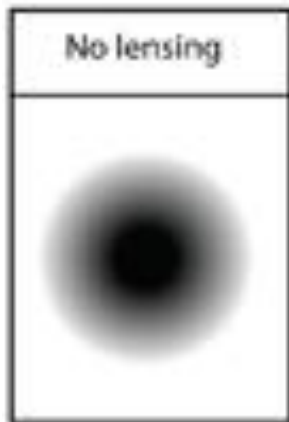
# Redshift space distortions



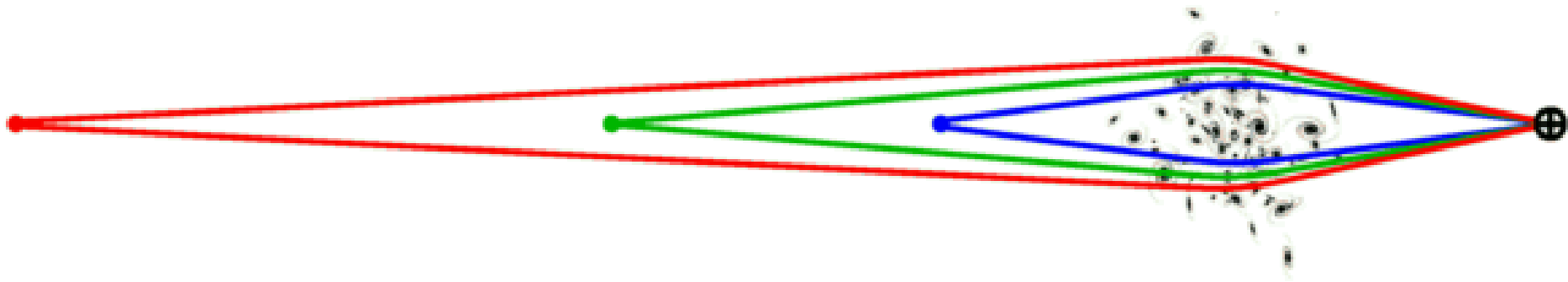
$$1 + \xi_s(s_{\parallel}, s_{\perp}) = \int_{-\infty}^{\infty} dr_{\parallel} [1 + \xi(r)] \underbrace{\mathcal{P}(r_{\parallel} - s_{\parallel}, \mathbf{r})}_{\mathbf{v}_p}$$

# Cosmology from Gravitational Lensing

Volume as function of redshift  
Growth of fluctuations with time

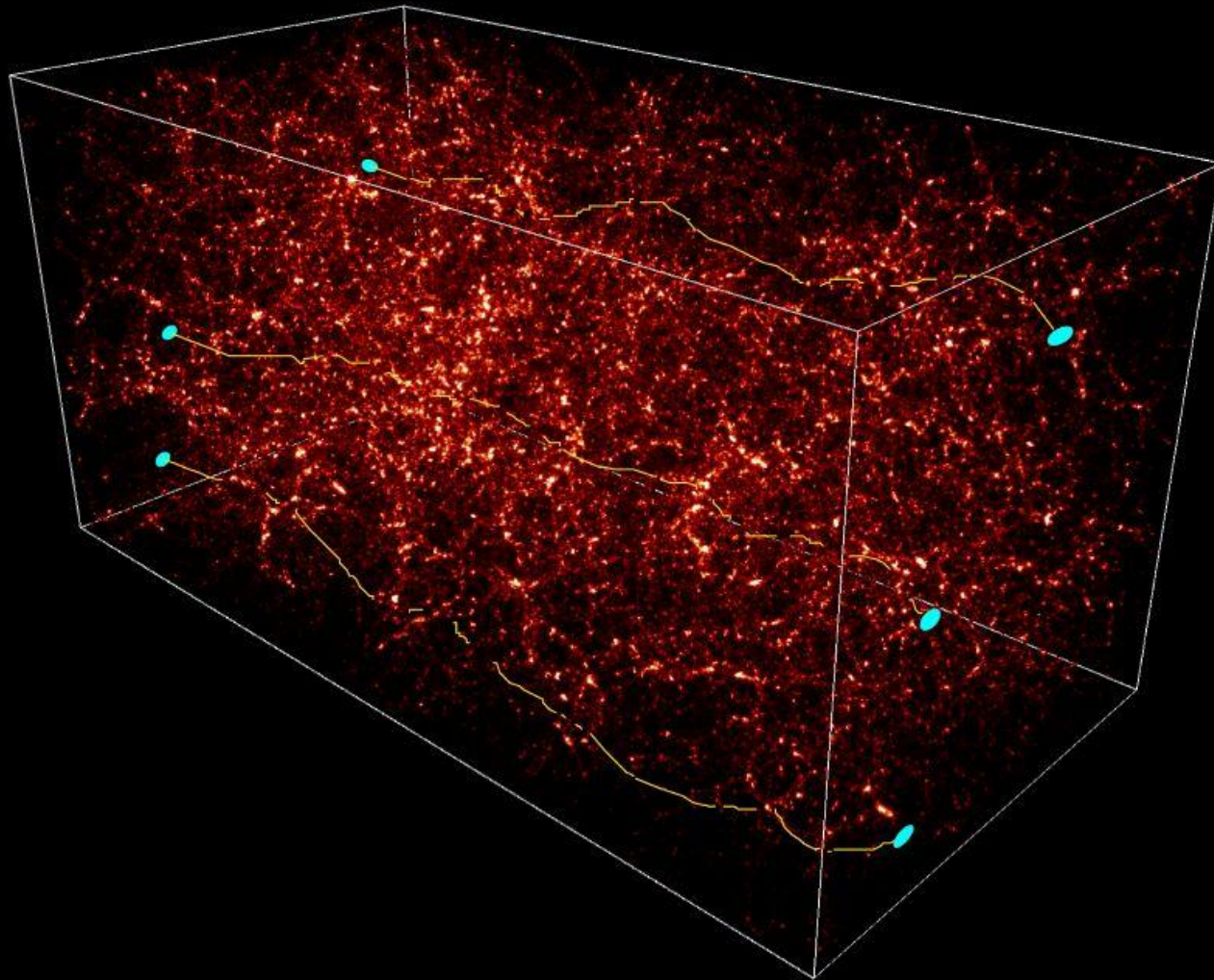






- Focal length strong function of cluster-centric distance; highly distorted images possible
- Strong lensing if source lies close to lens-observer axis; weaker effects if impact parameter large
- Strong lensing: Cosmology from distribution of image separations, magnification ratios, time delays; but these are rare events, so require large dataset
- Weak lensing: Cosmology from correlations (shapes or magnifications); small signal requires large dataset

*DEFLECTION OF LIGHT RAYS CROSSING THE UNIVERSE, EMITTED BY DISTANT GALAXIES*



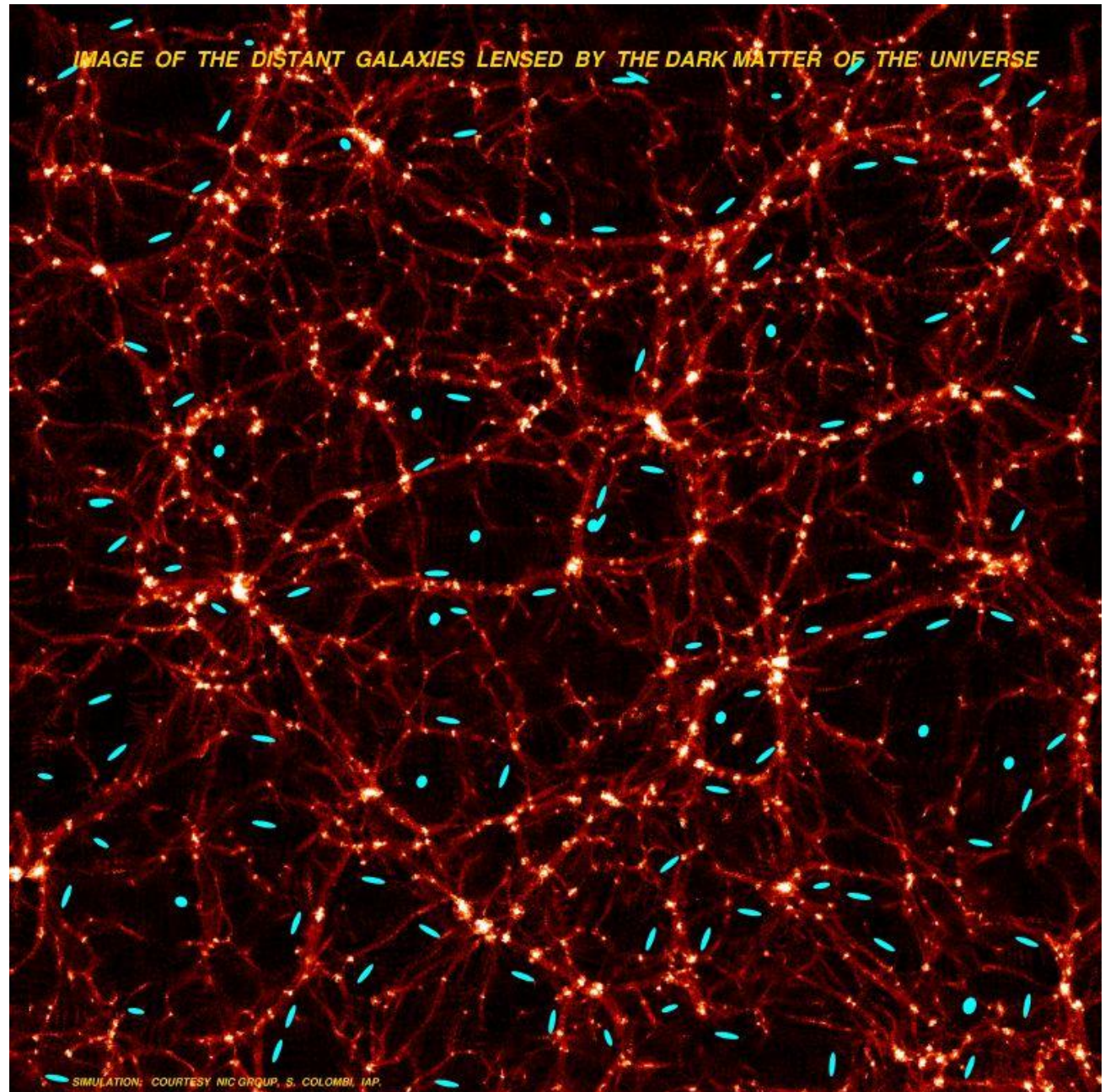
SIMULATION: COURTESY NIC GROUP, S. COLOMBI, IAP.

Lensing provides a measure of dark matter along line of sight

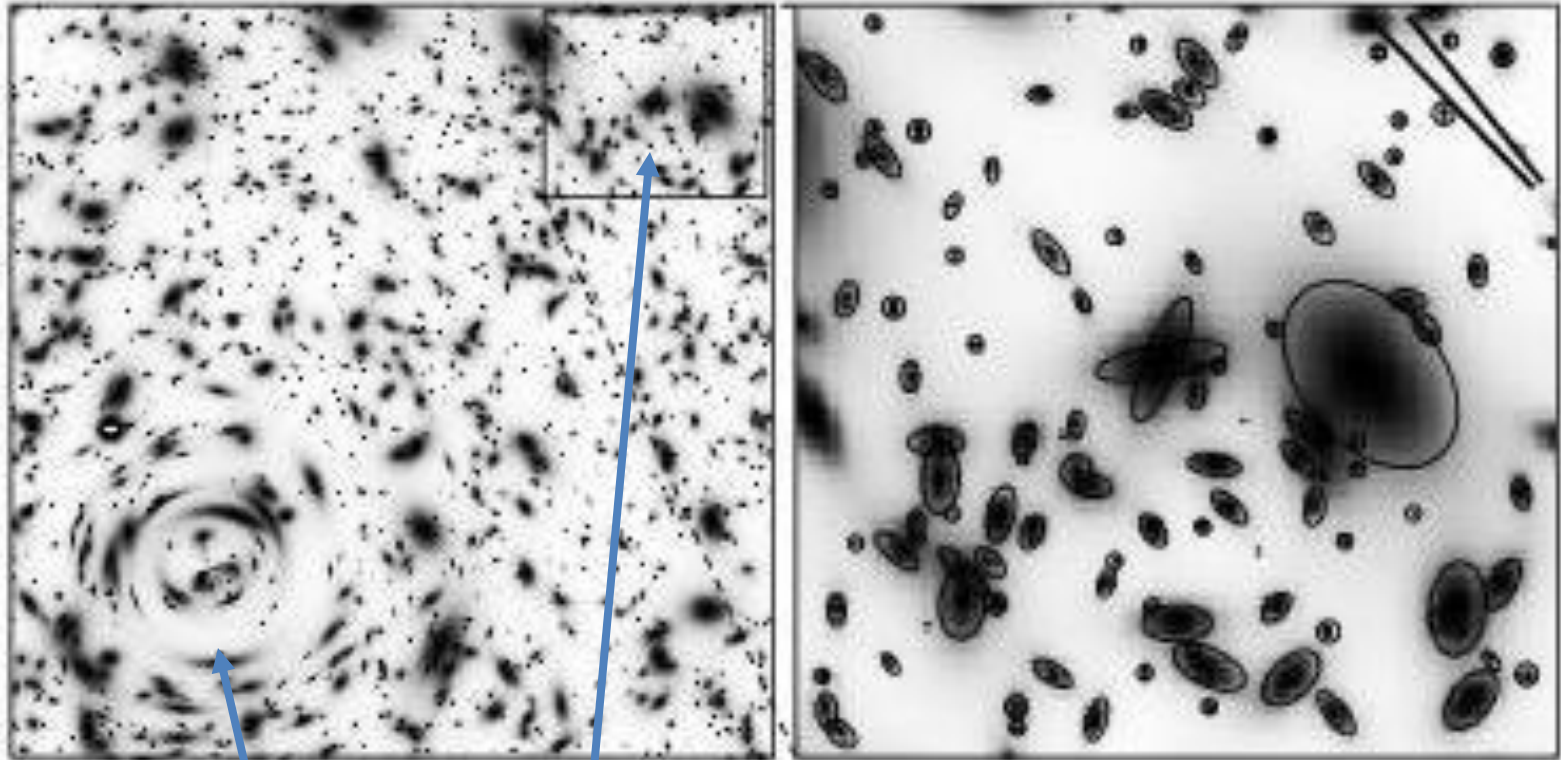


Weak lensing:  
Image  
distortions  
correlated with  
dark matter  
distribution

E.g., lensed  
image  
ellipticities  
aligned parallel  
to filaments,  
tangential to  
knots (clusters)



# The shear power of lensing



stronger

weaker

Cosmology from measurements of correlated shapes; better constraints if finer bins in source or lens positions possible





# Halo Model is simplistic ...

- Nonlinear physics on small scales from virial theorem
- Linear perturbation theory on scales larger than virial radius (exploits 20 years of hard work between 1970-1990)
- Halo mass is more efficient language (than e.g., dark matter density) for describing nonlinear field

...but quite accurate!

Halo-  
model

$\approx$

Circles in  
circles





# Cosmology from Large Scale Structure Sky Surveys

- Baryon Acoustic Oscillations
- Cluster counts and clustering
- Redshift space distortions
- Weak gravitational lensing
- Supernovae IA
- Your name here!