

# Measuring and Analysing Galaxy Clustering with SDSS Photometric Data

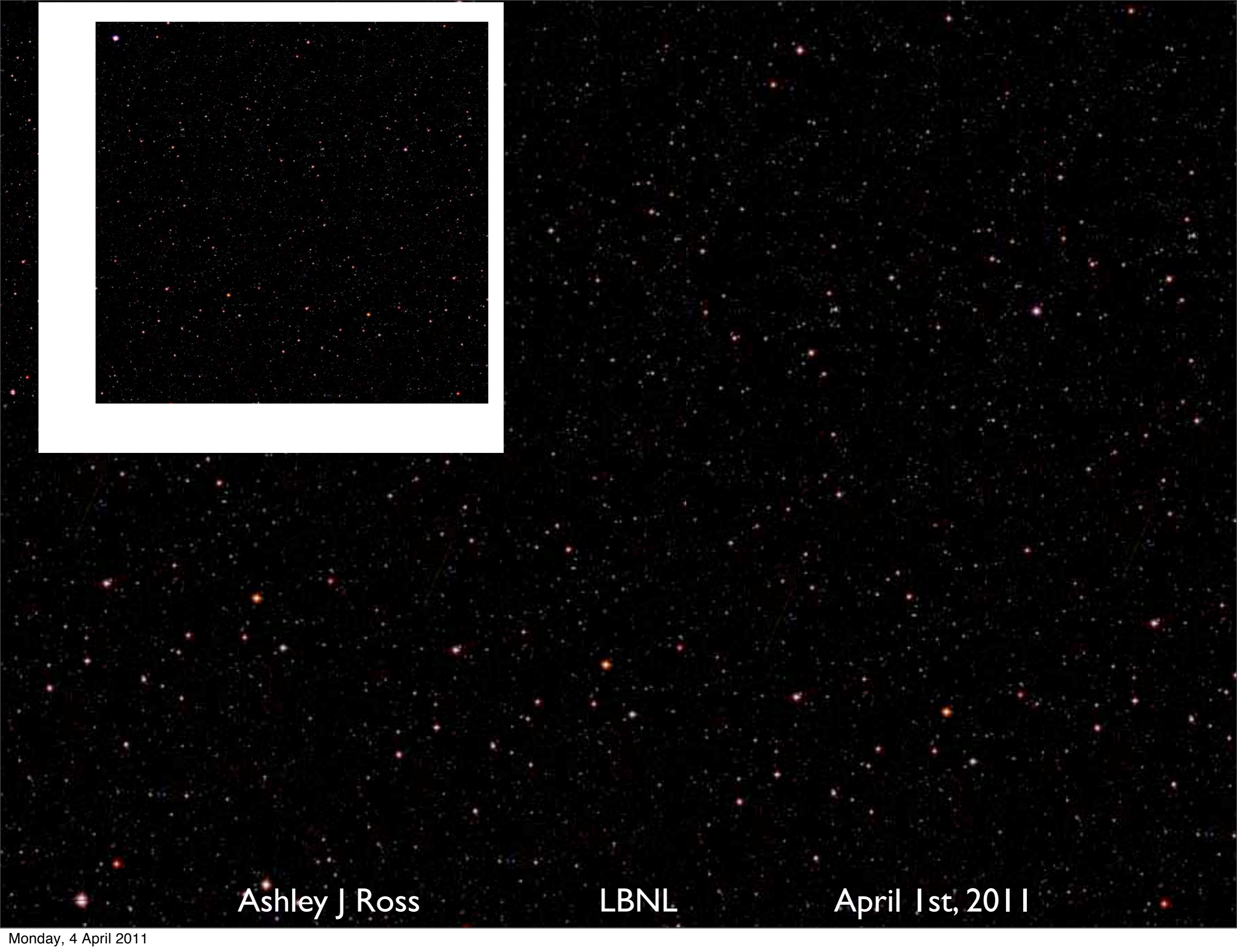
Ashley J Ross  
(University of Portsmouth)

Collaborators:

Will Percival, Rita Tojeiro, Robert Brunner

# Outline

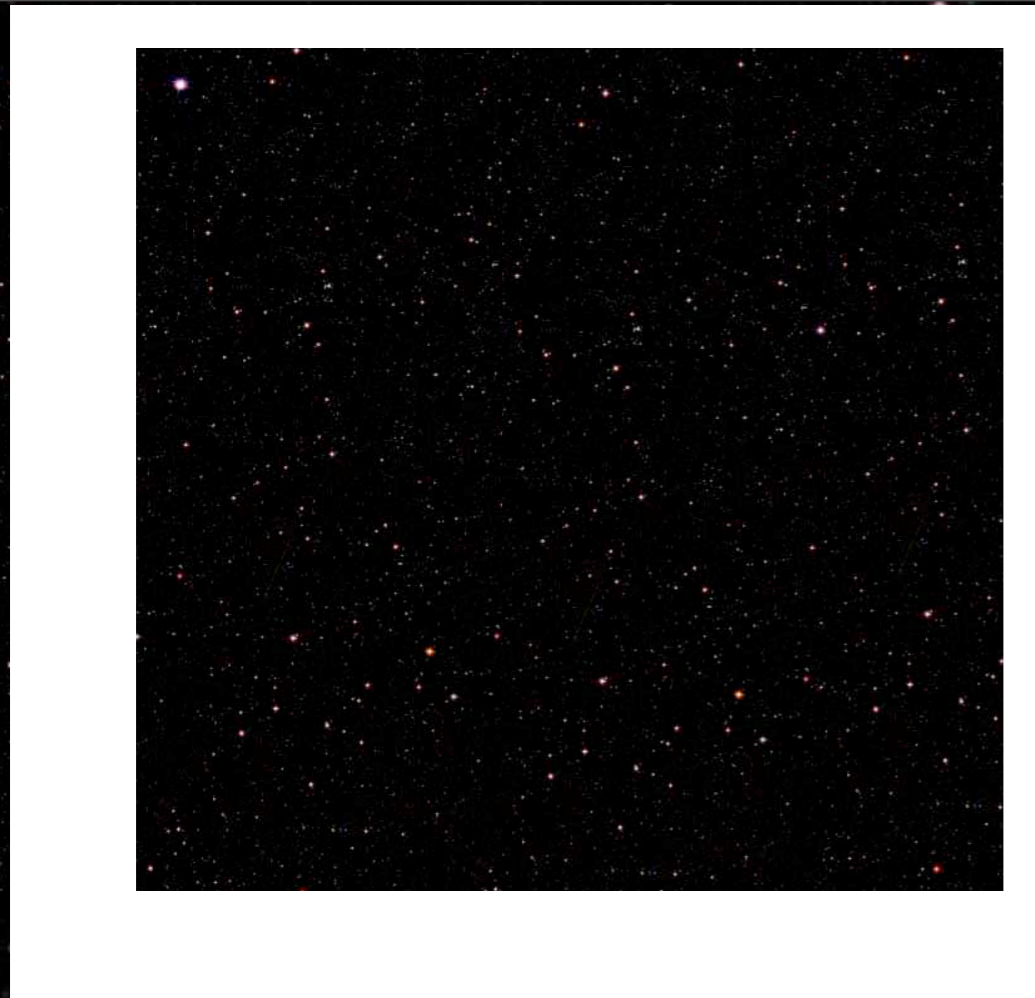
- Measuring clustering with photometric surveys
- Bias of red galaxies
- HOD constraints from SDSS data
- DES and beyond



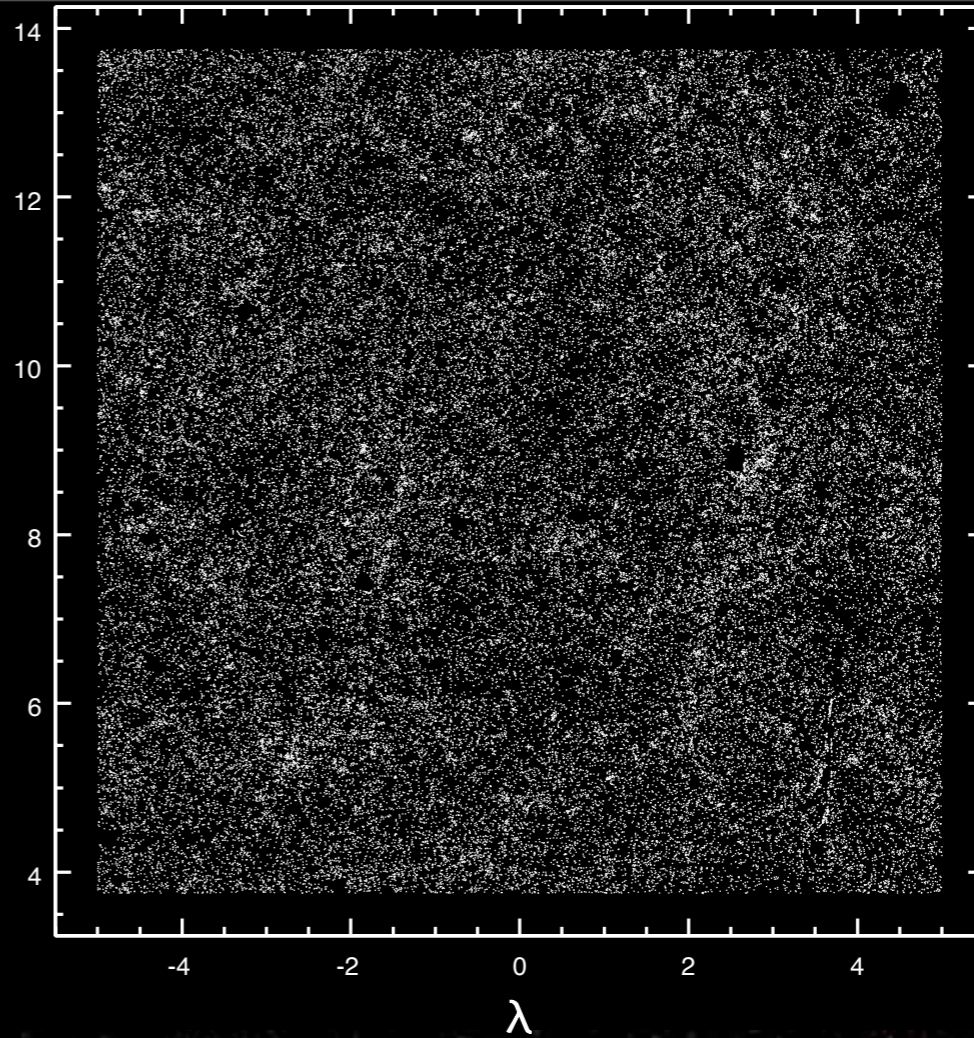
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LBNL

April 1st, 2011



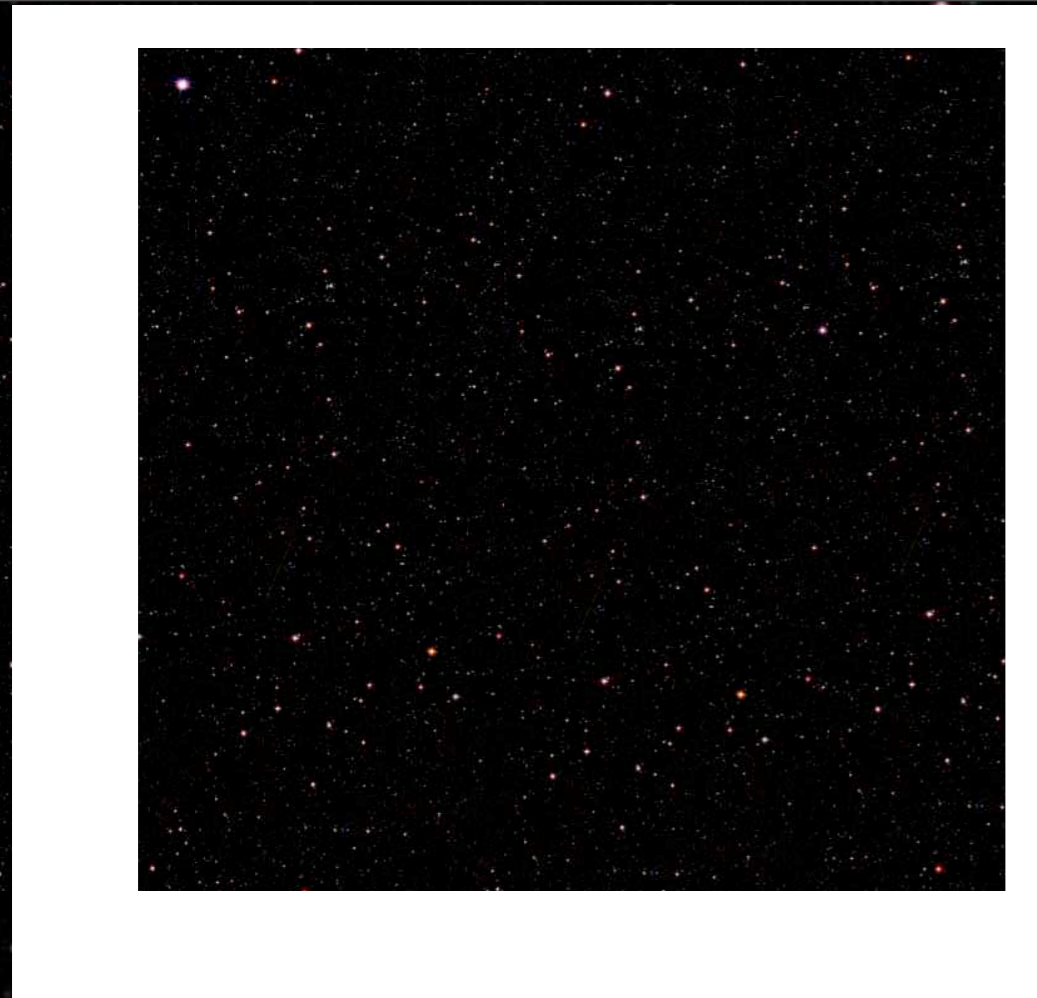
$\eta$



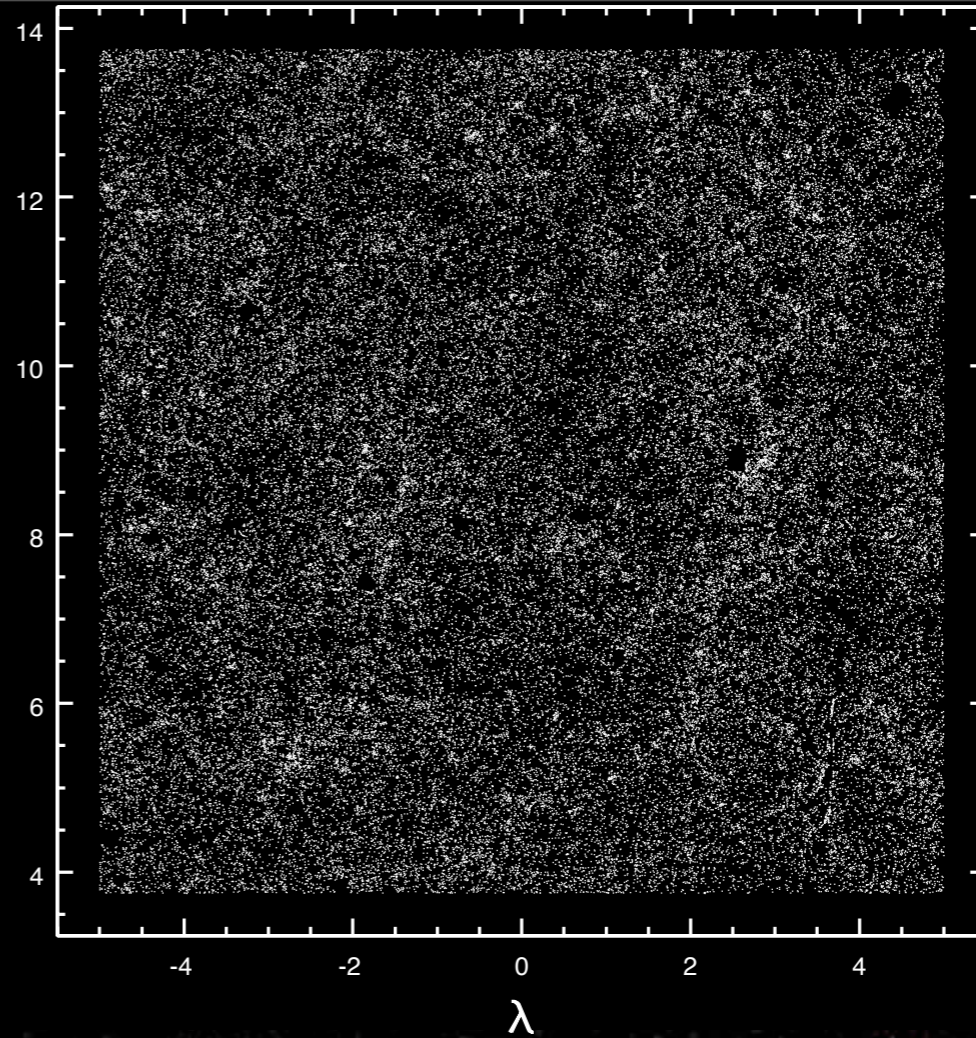
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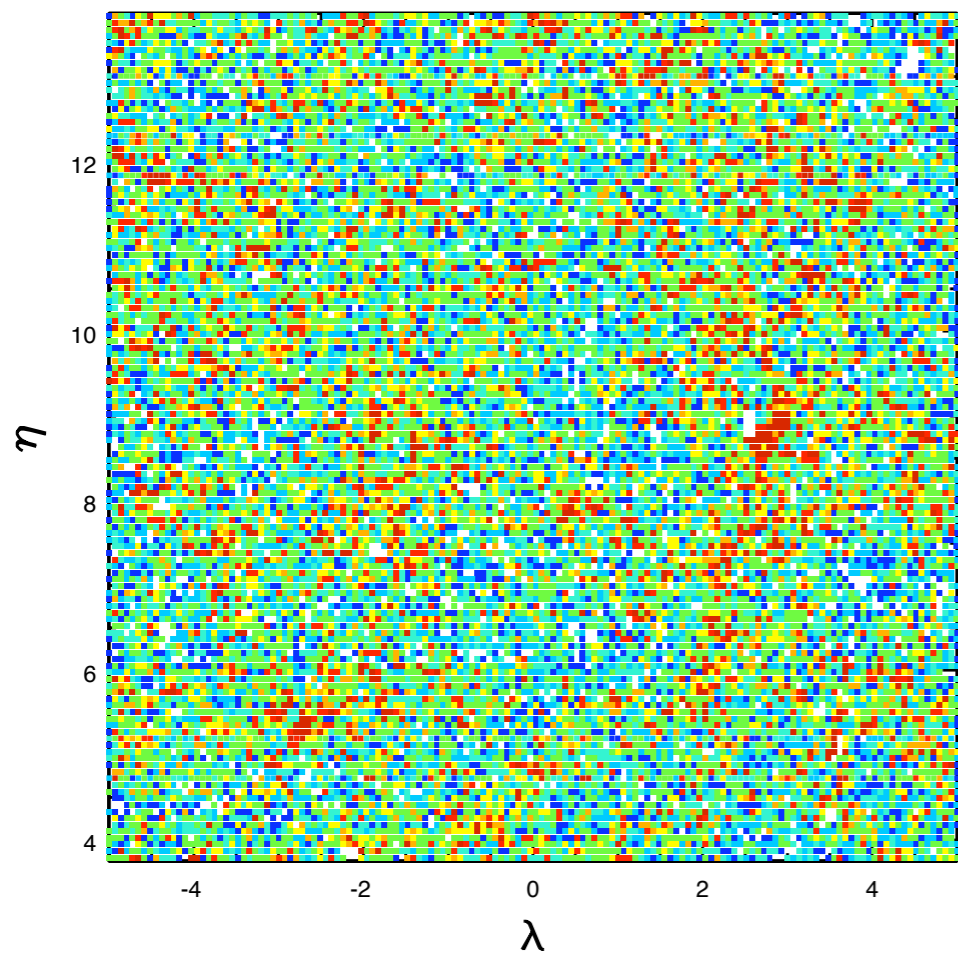
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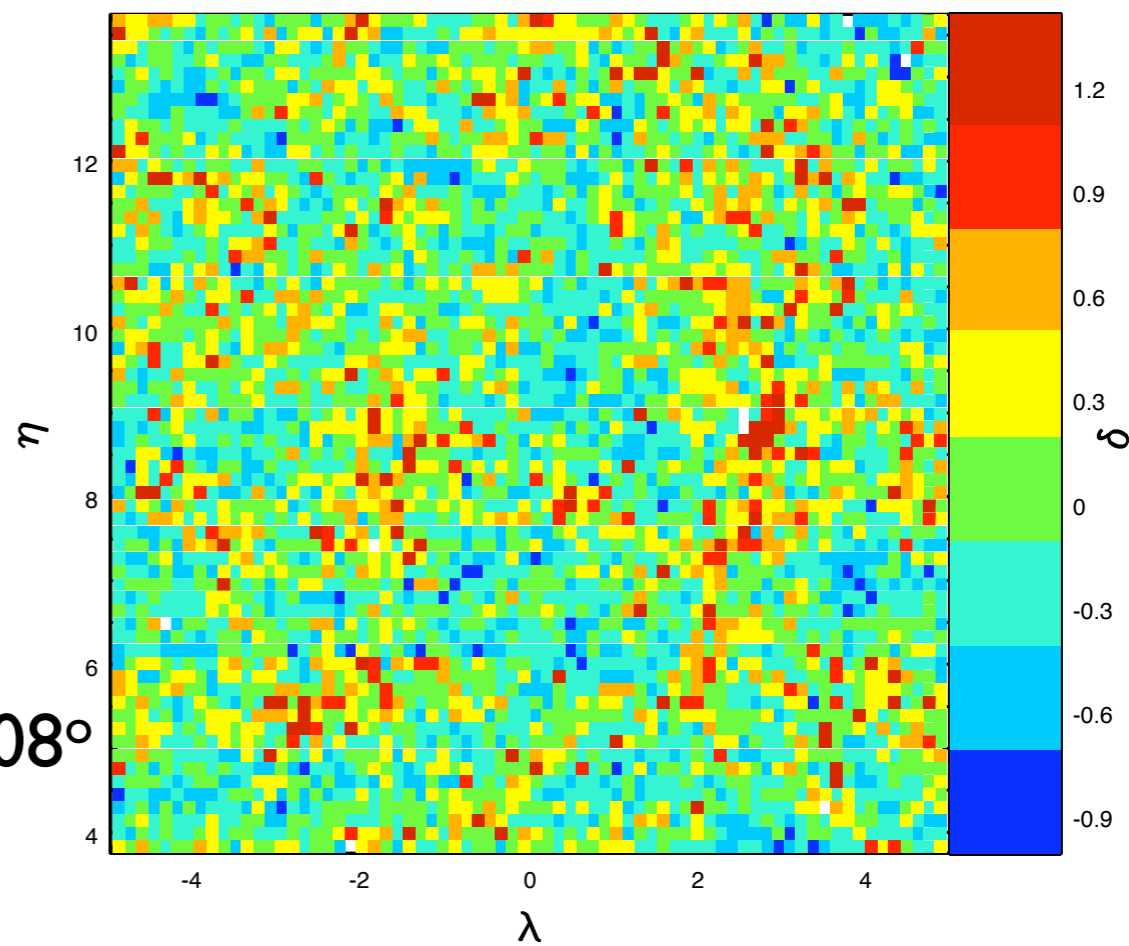
$\eta$



$\sim 0.04^\circ$



$\sim 0.08^\circ$



# Correlation Functions

- Overdensity,  $\delta = \frac{N}{\langle N \rangle} - 1$
- 2-point angular correlation function,  $w$ :  
 $w_2(\theta) = \langle \delta_i \delta_j \rangle$

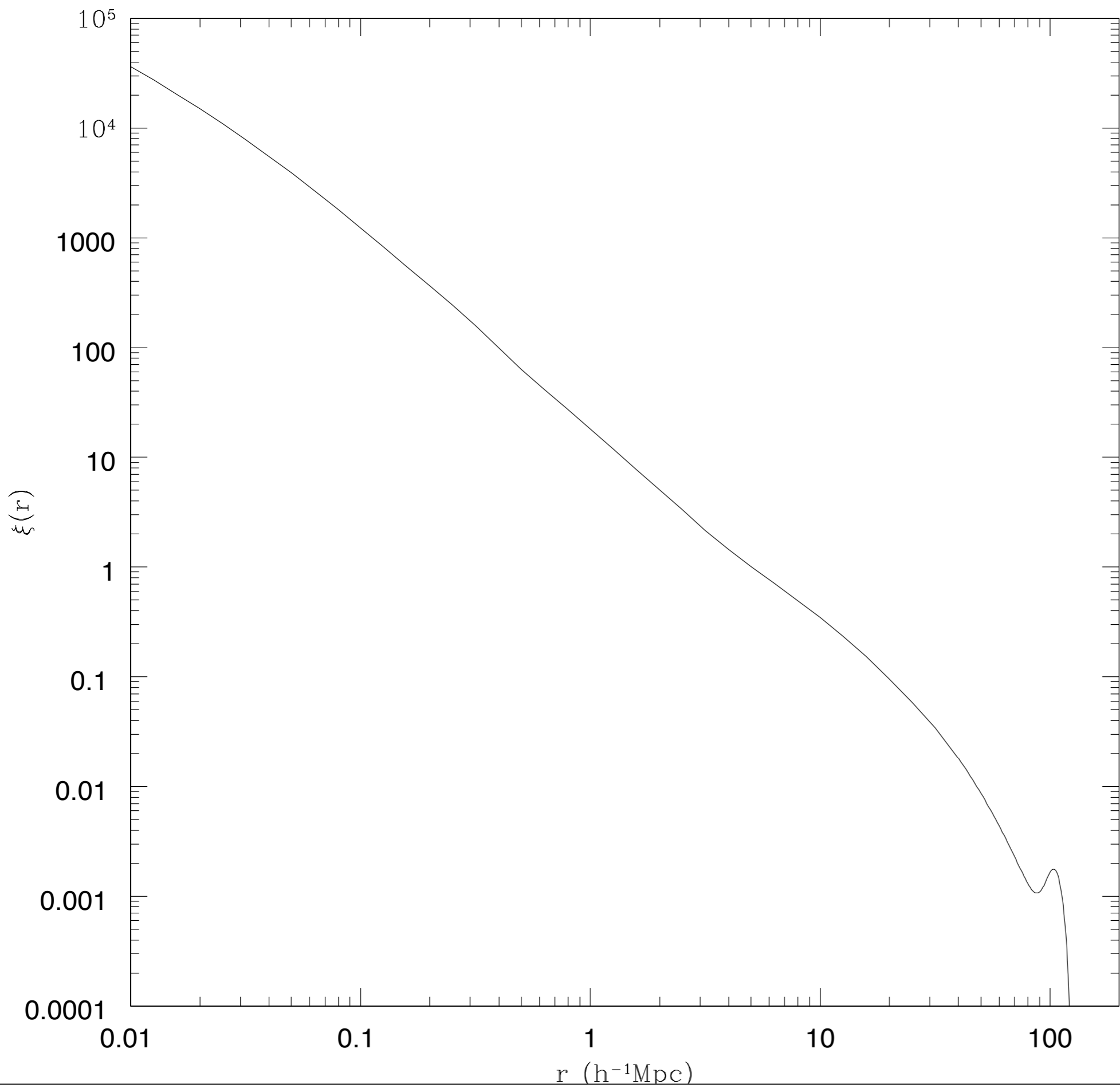
- Alternatively:

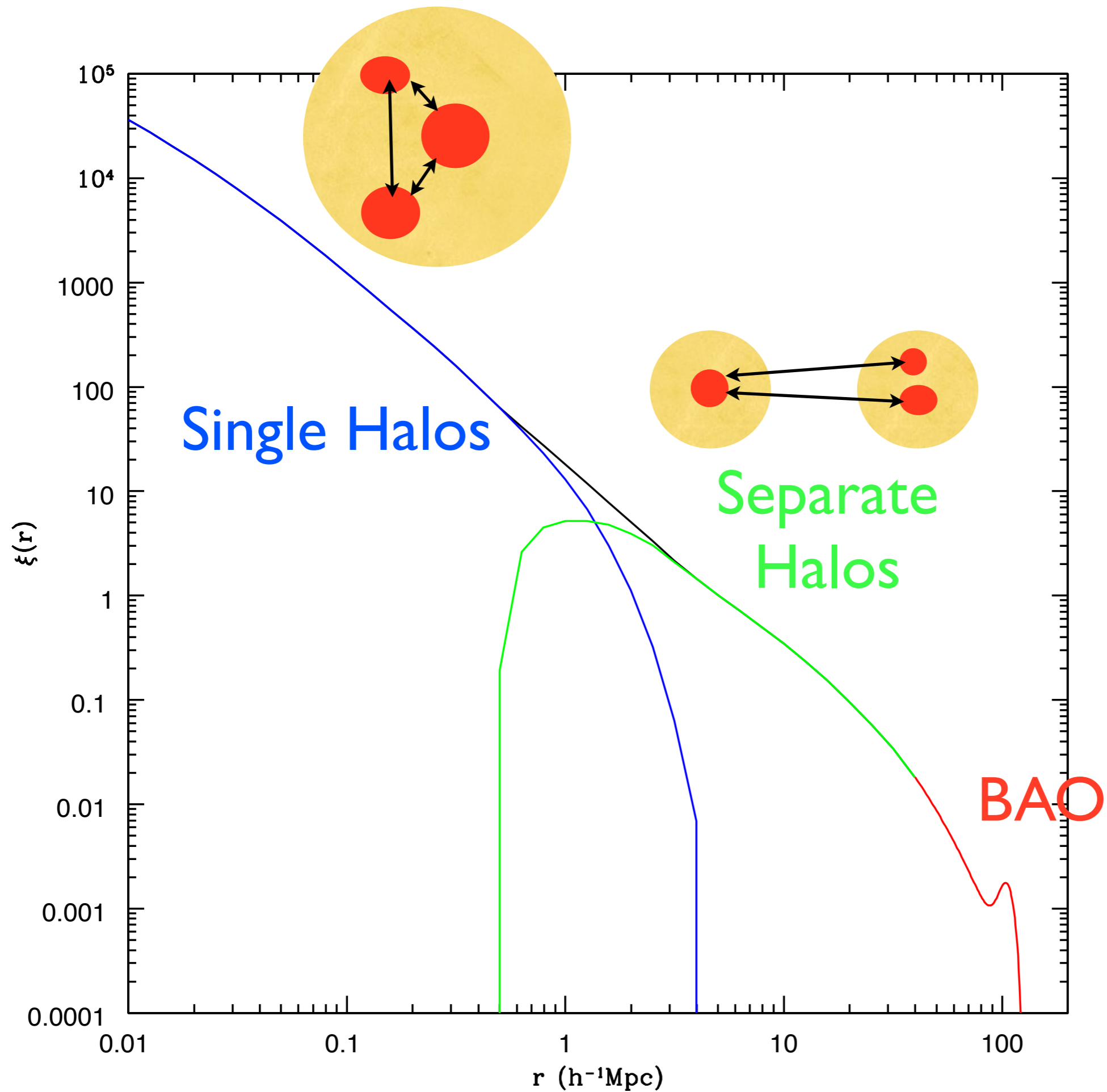
$$w_2(\theta) = DD(\theta)/RR(\theta) - 1$$

- Real-space denoted

$$\xi_2(r)$$

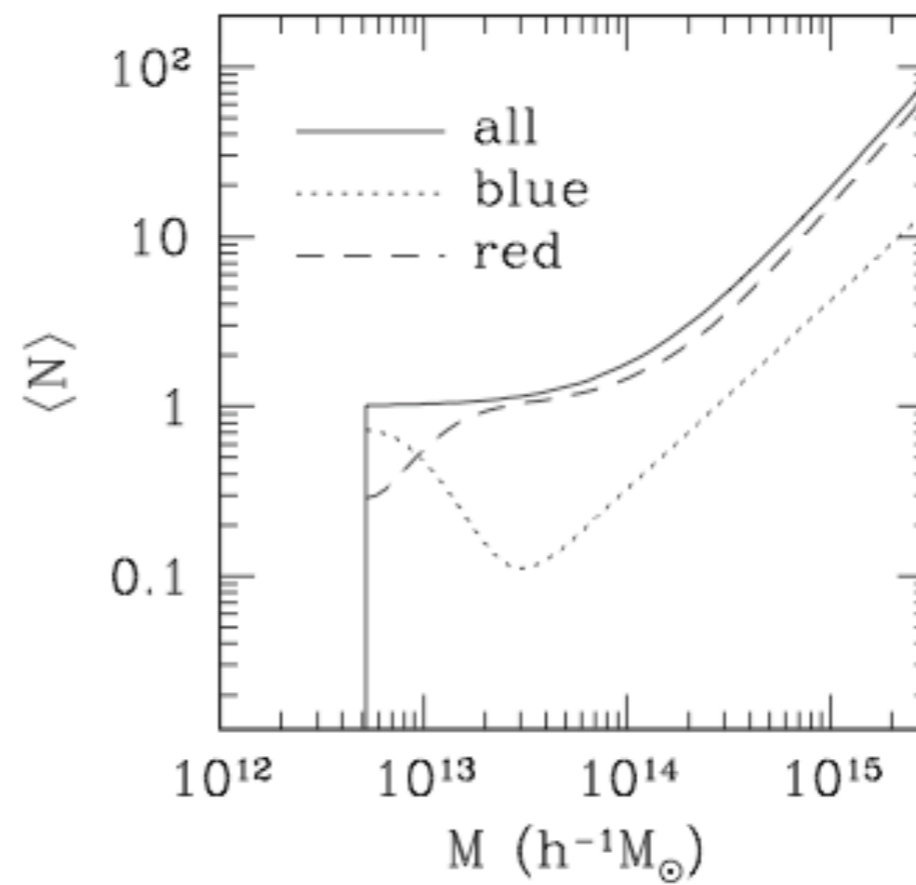
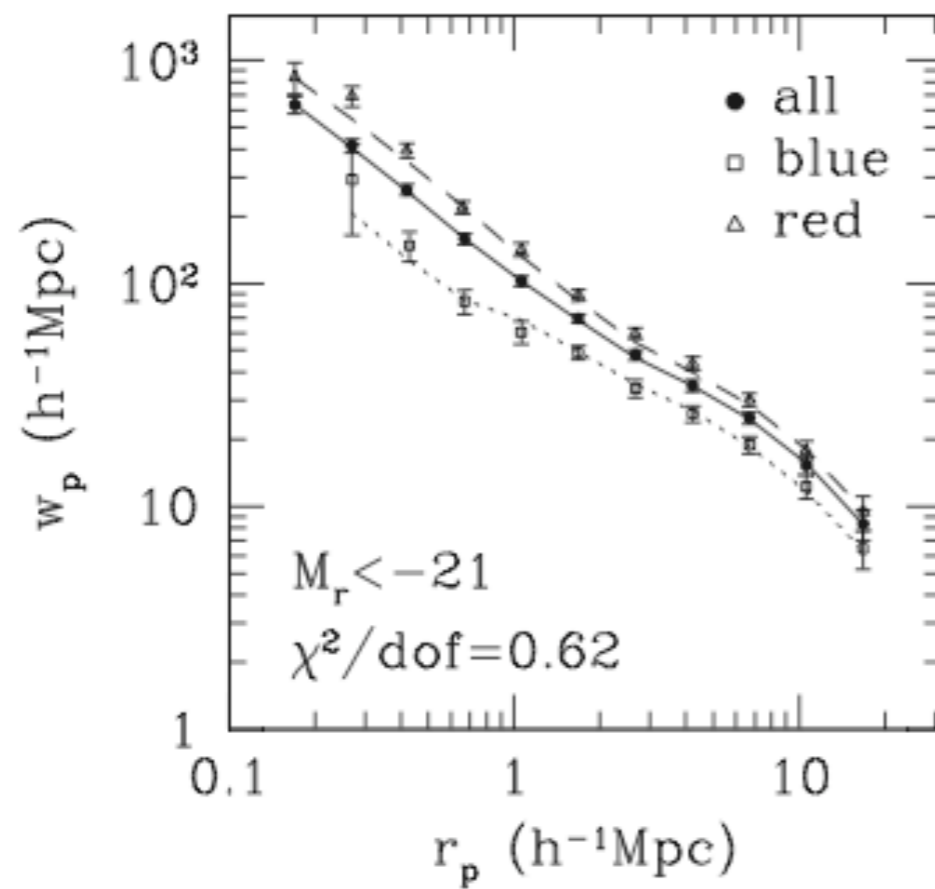
- Fourier transform  $P(k)$ , angular version  $C_\ell$



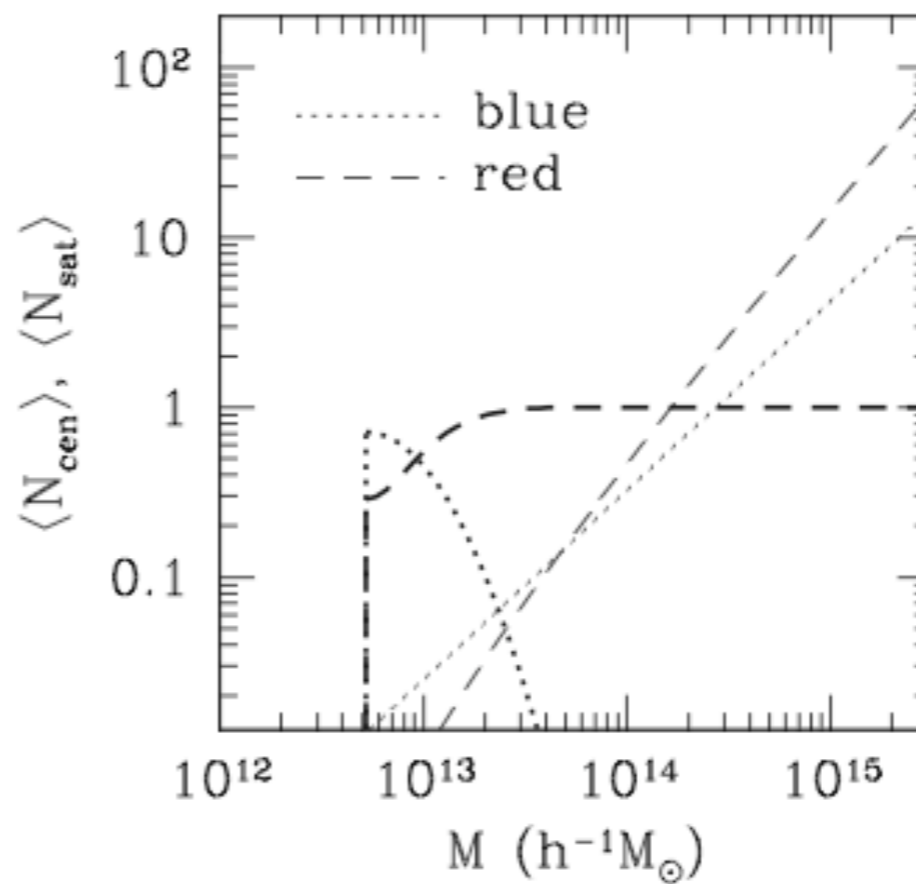
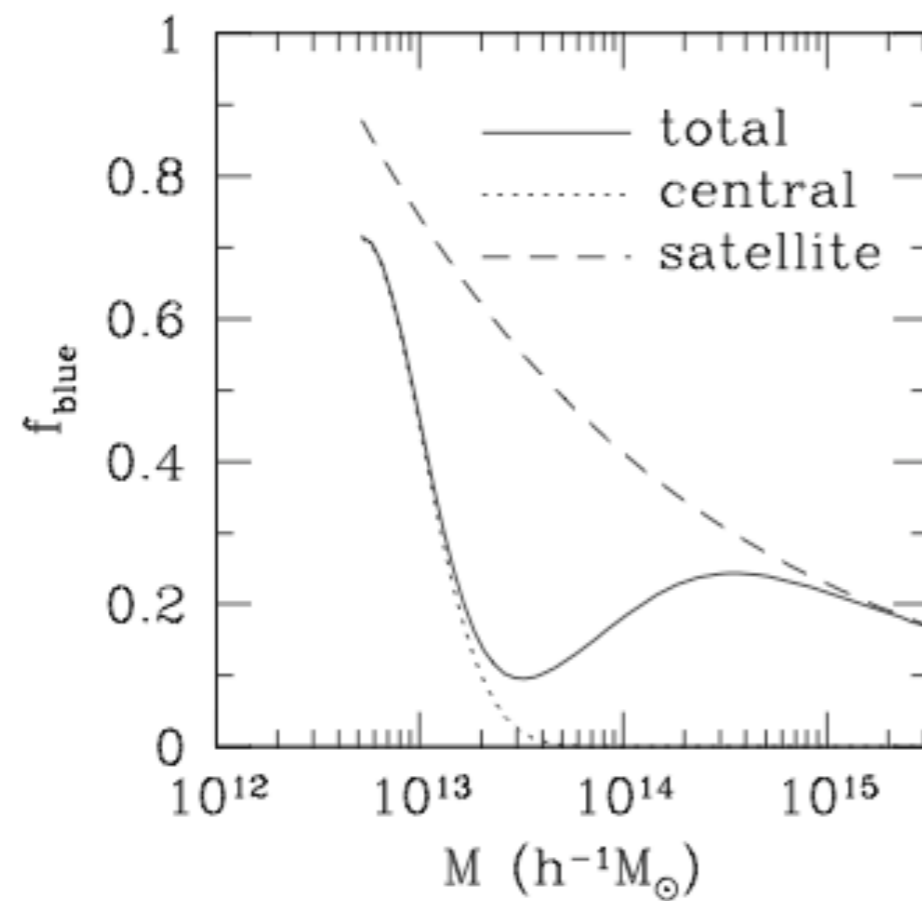


# Why Measure Galaxy Clustering?

- Two main scientific pursuits:
  - 1) Study galaxies themselves
  - 2) Measure cosmological parameters

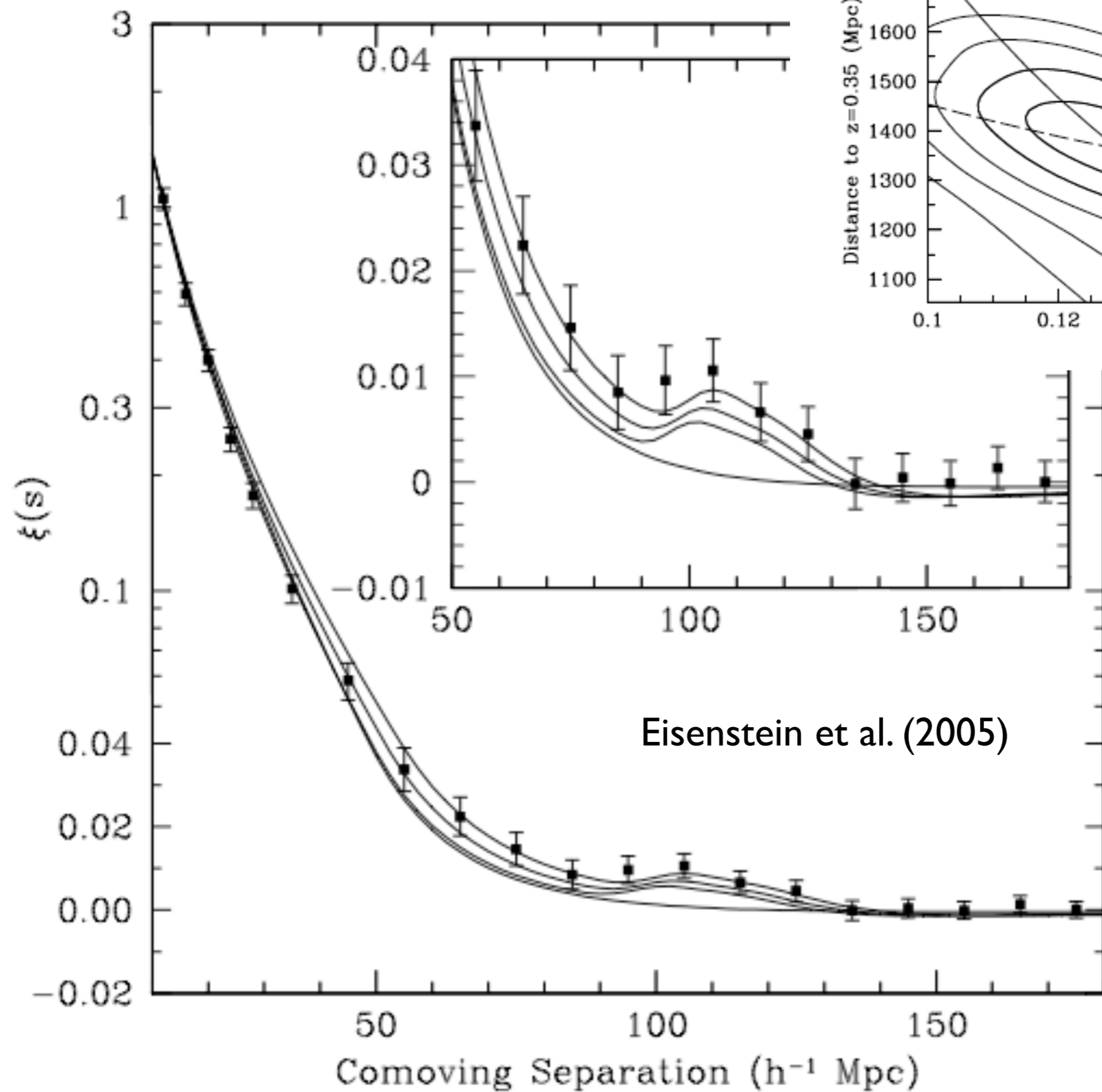


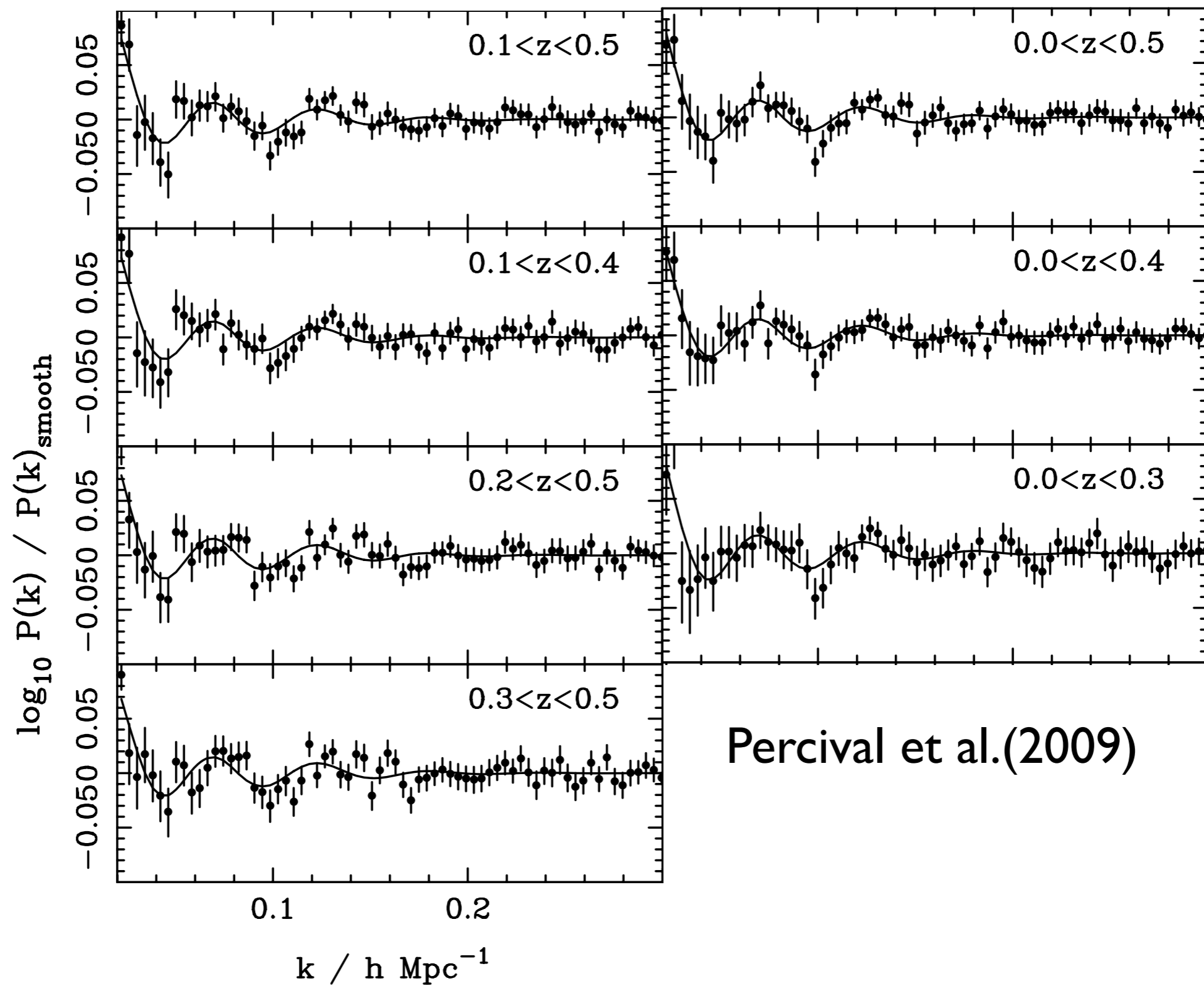
Zehavi et al. (2005)



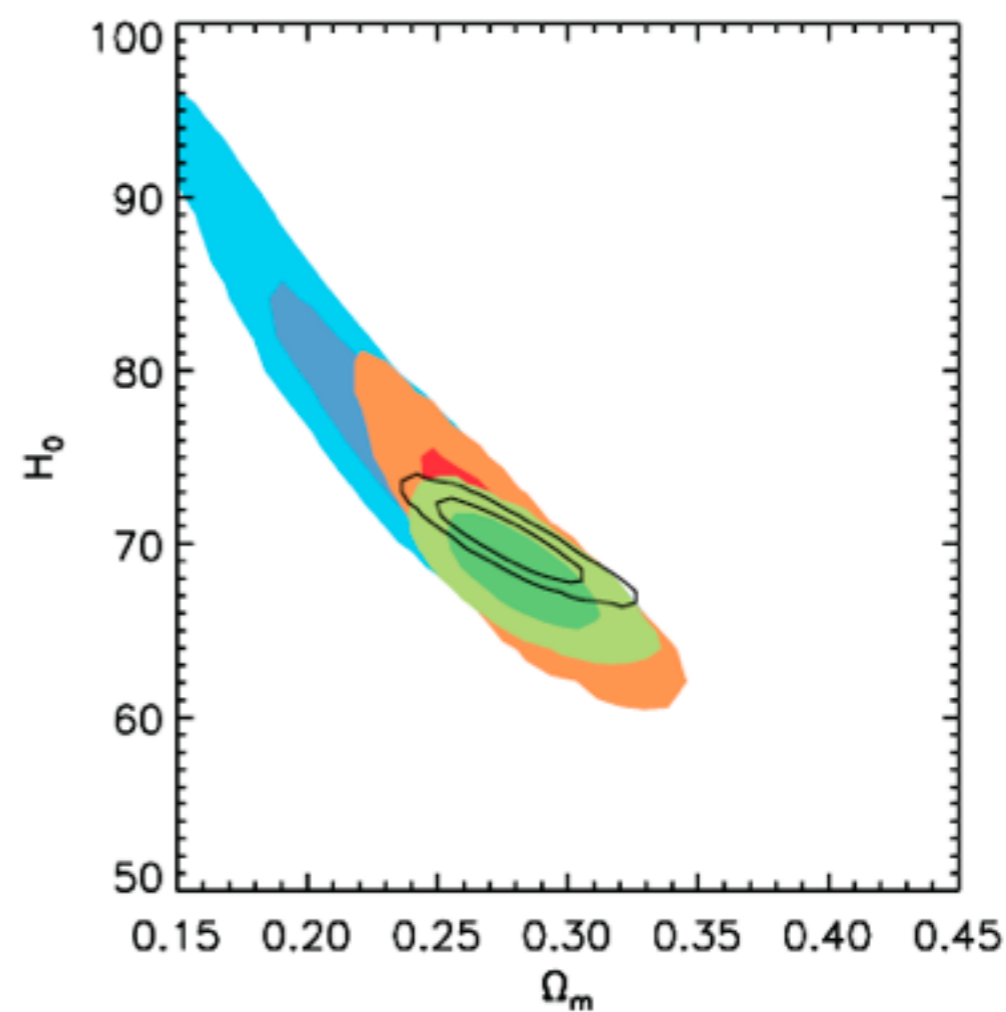
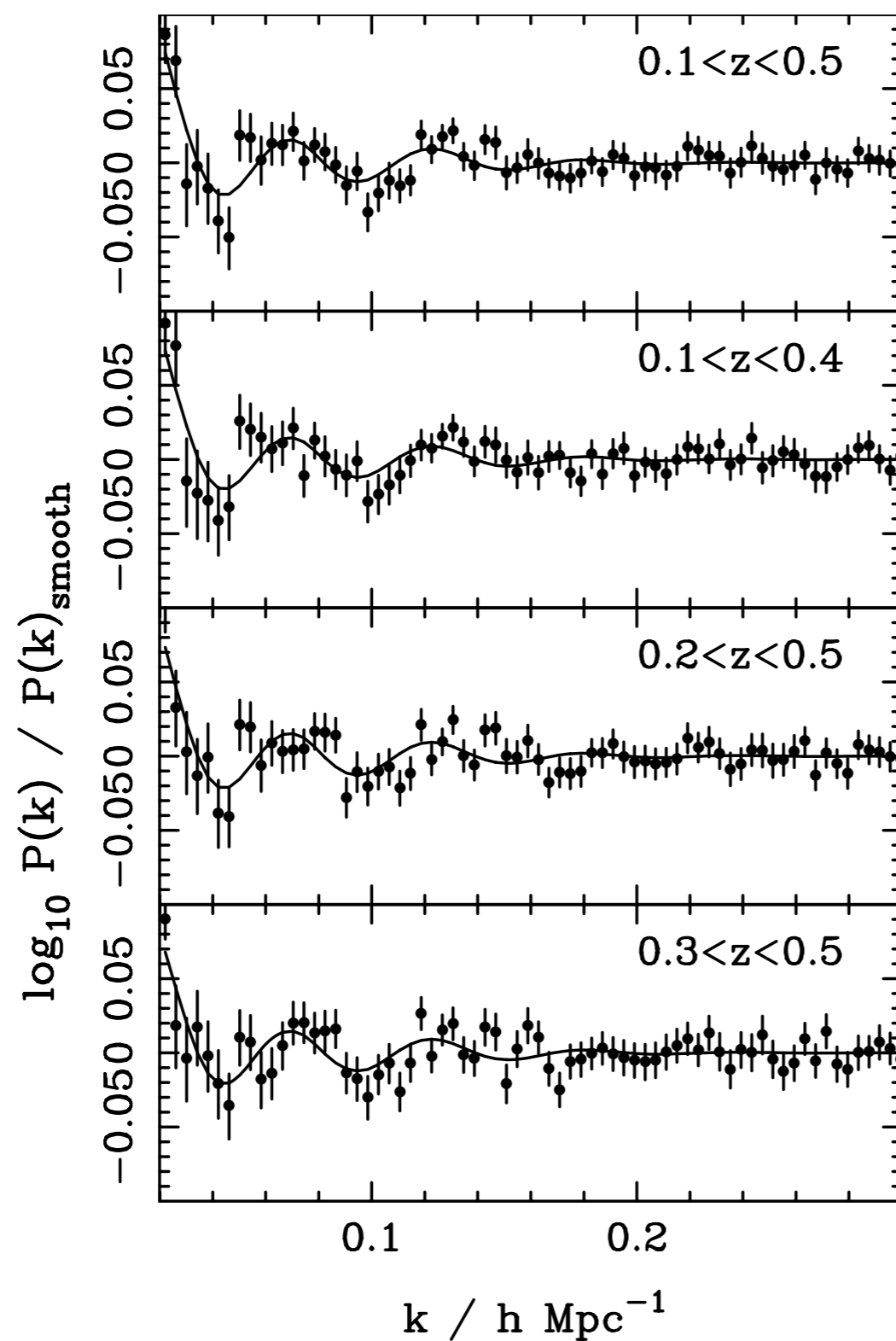
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Percival et al.(2009)

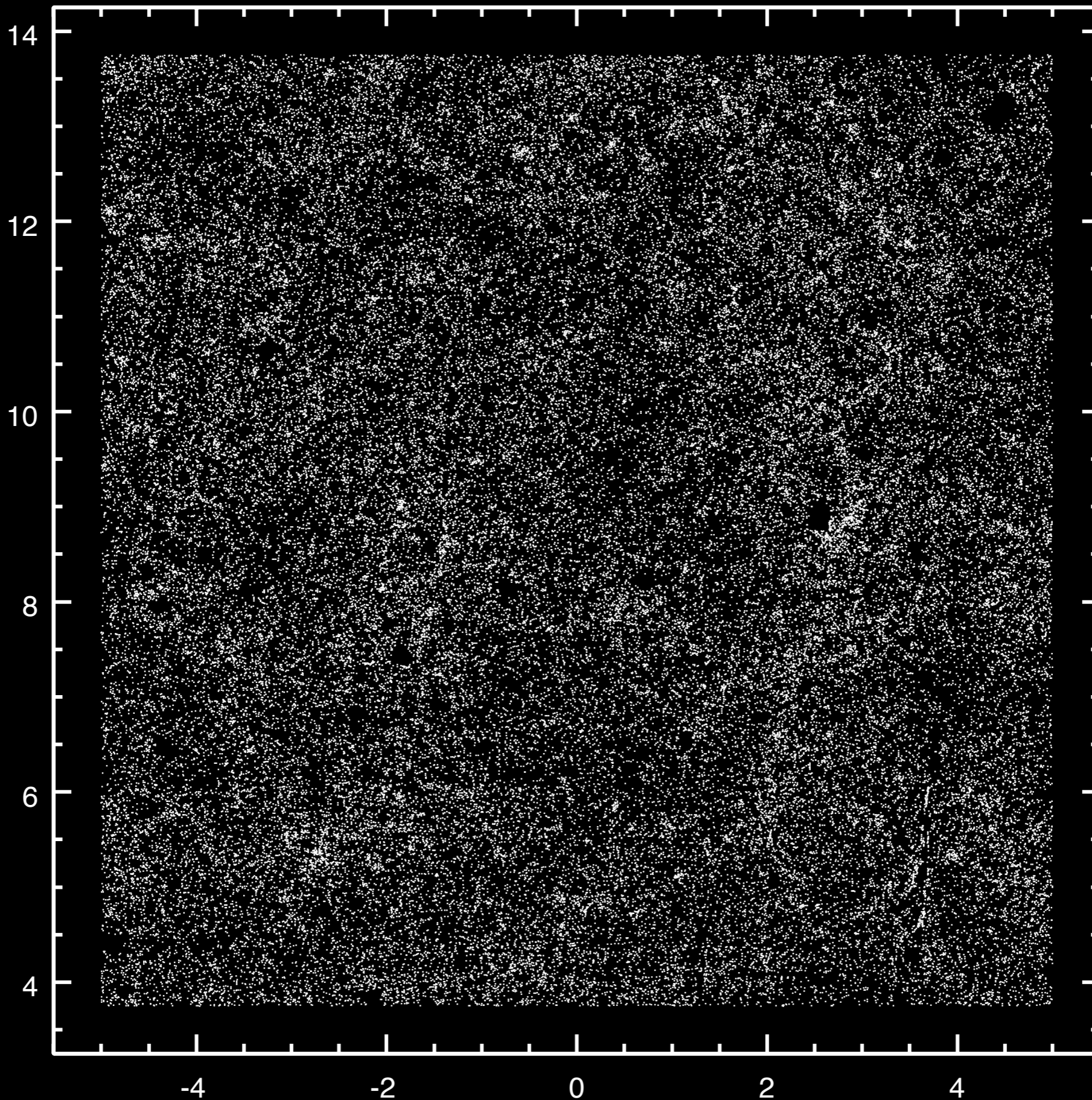


Percival et al.(2009)

# Why Photometric Surveys?

- More objects at higher redshifts (SDSS has  $\sim 2 \times 10^7$  photoz galaxies;  $L^*$  observable to  $z \sim 0.4$ )
- Extremely precise measurements, no fibre collisions
- Upcoming, deeper, wide-field surveys will rely primarily on photometry (DES, Pan-STARRS, LSST)

$\eta$



$\zeta$

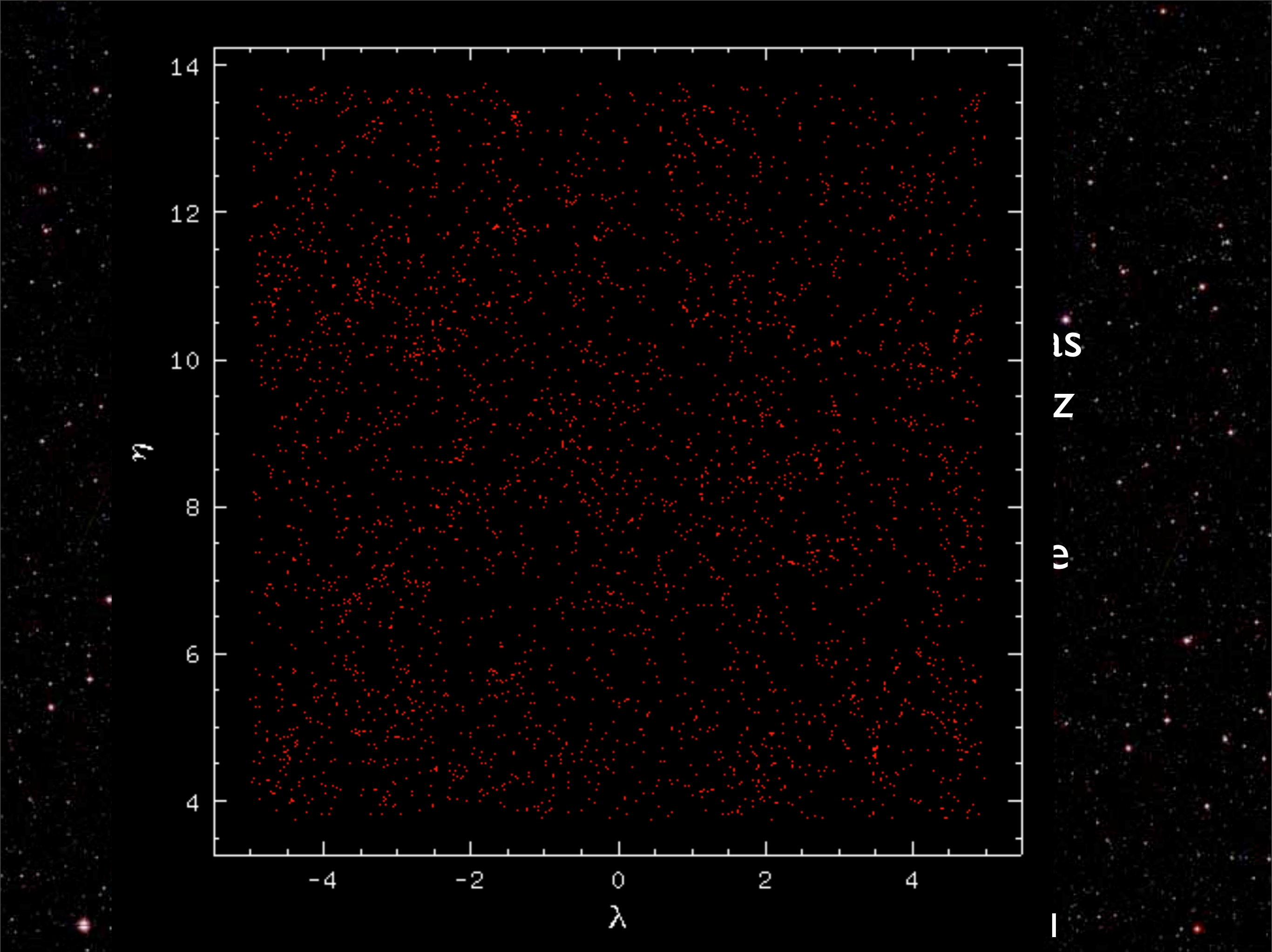
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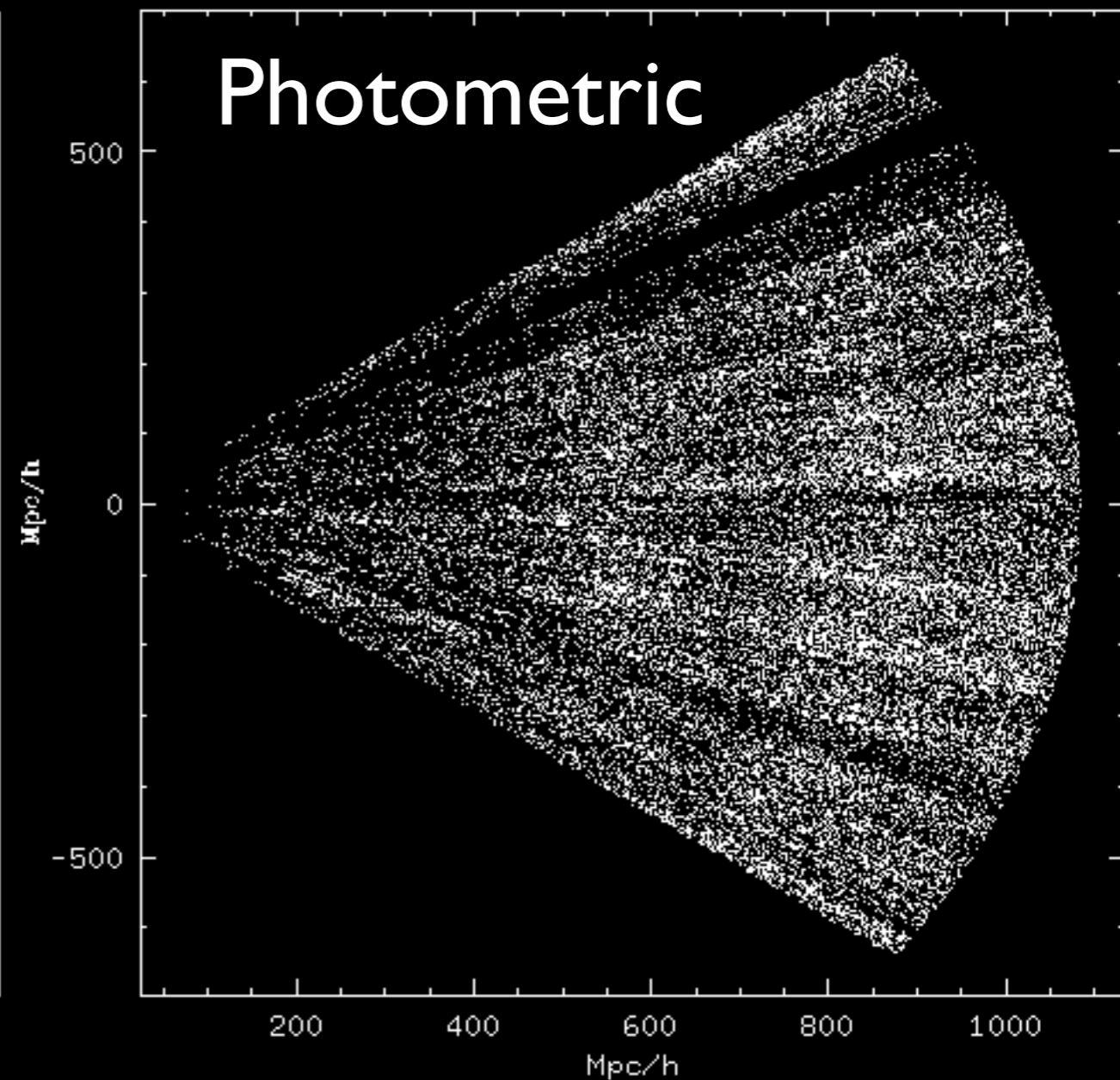
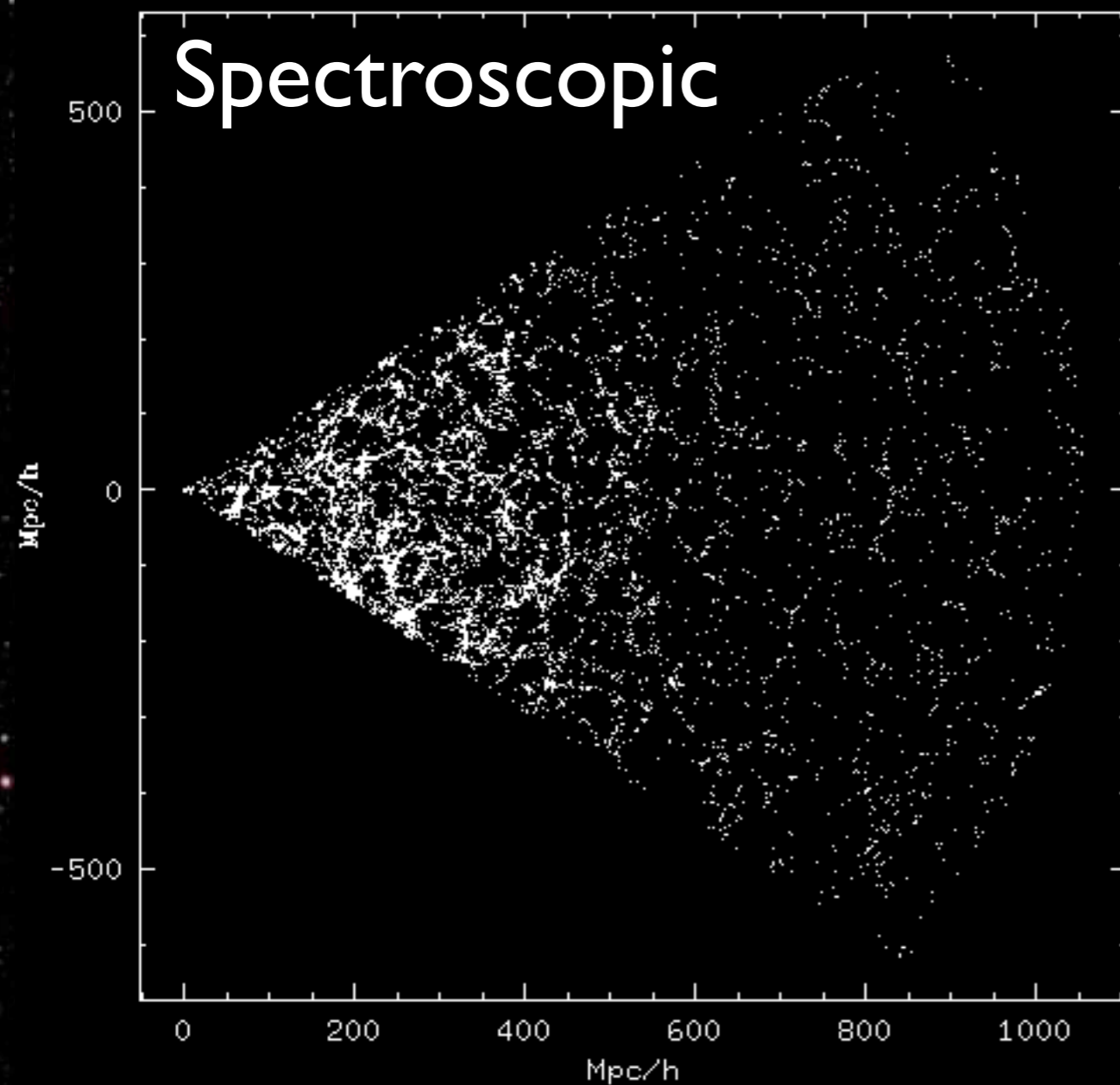
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# Photometric Redshifts

- *(u)griz(y)* imaging surveys allow  $\Delta z_{phot} \sim 0.03(1 + z)$
- One can accurately recreate  $dn/dz$  if errors well understood
- Radial clustering nearly wiped out

# Radial Clustering Wiped Out

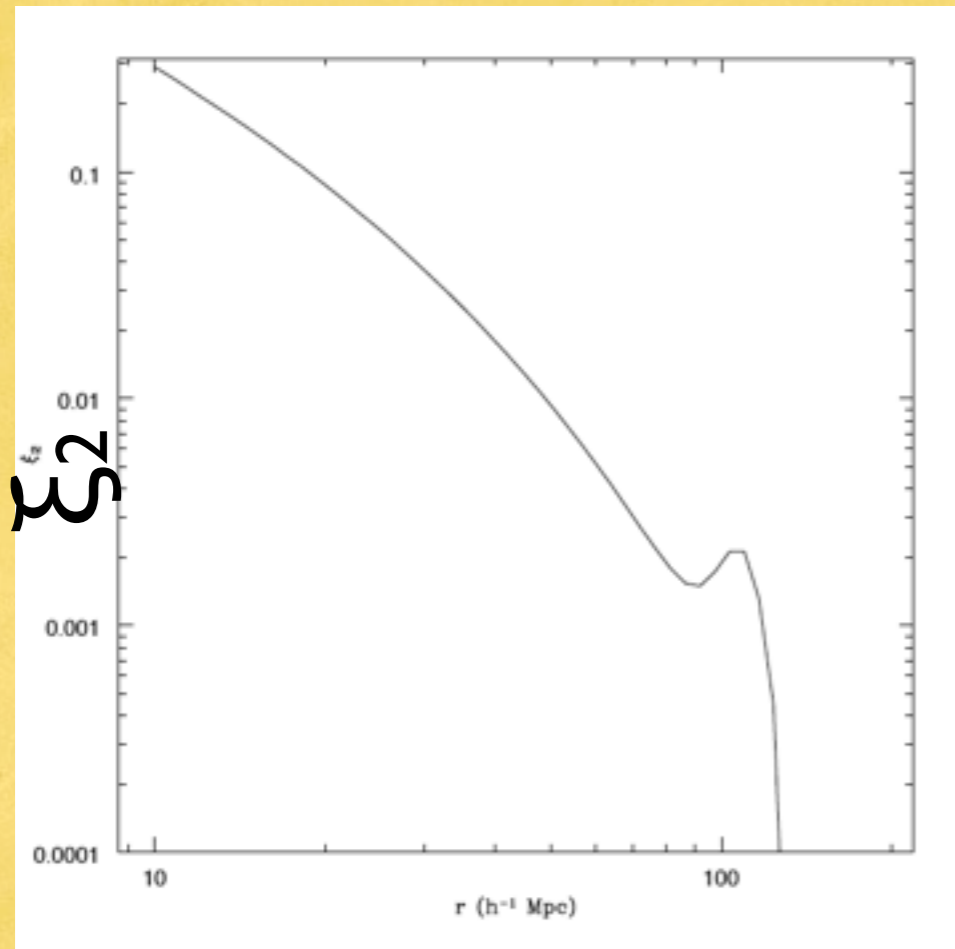


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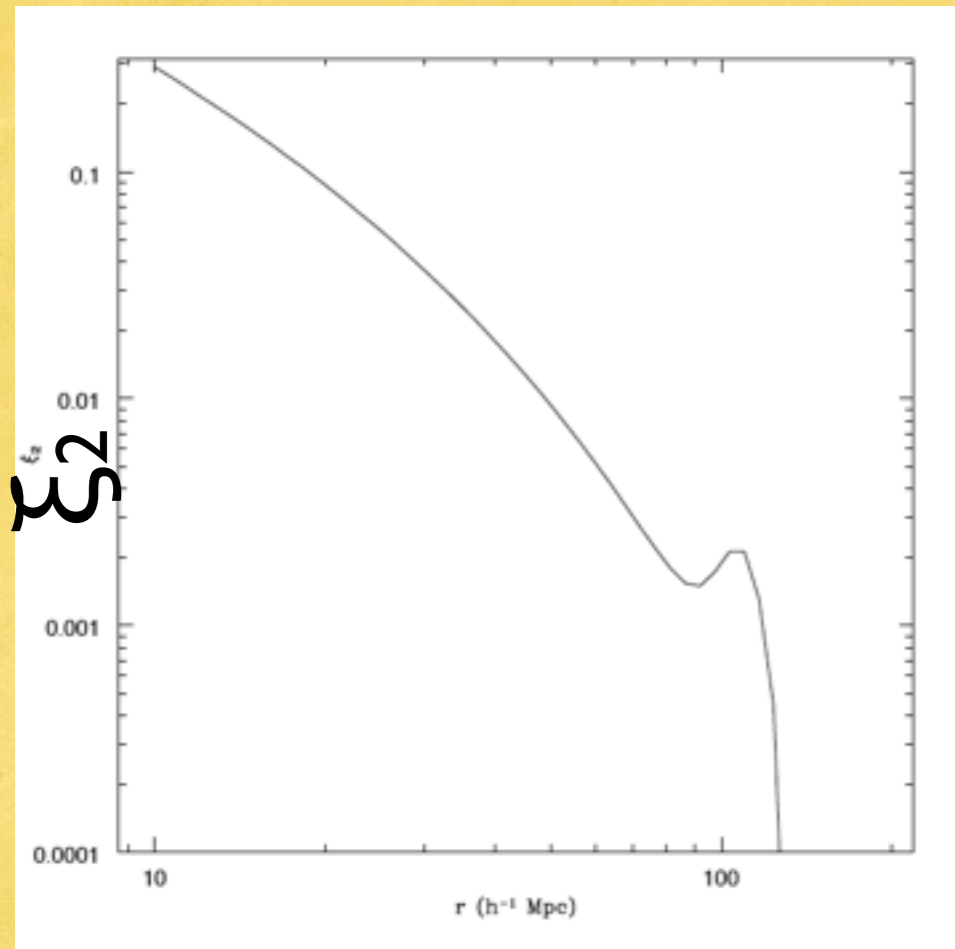
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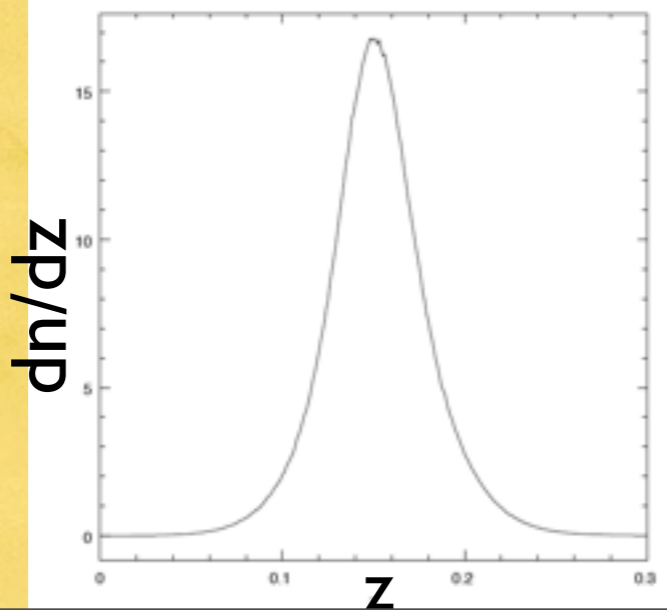
# BAO Peak Smeared



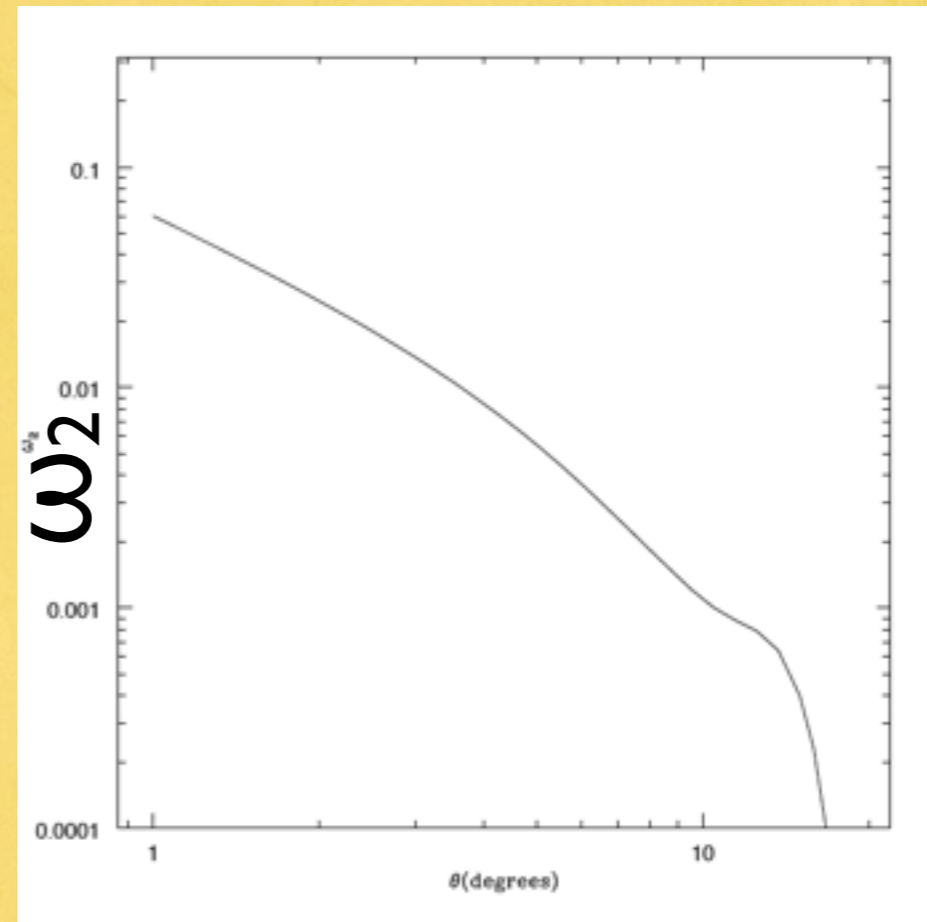
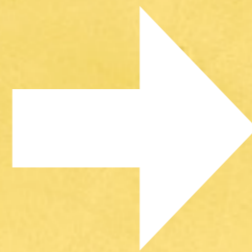
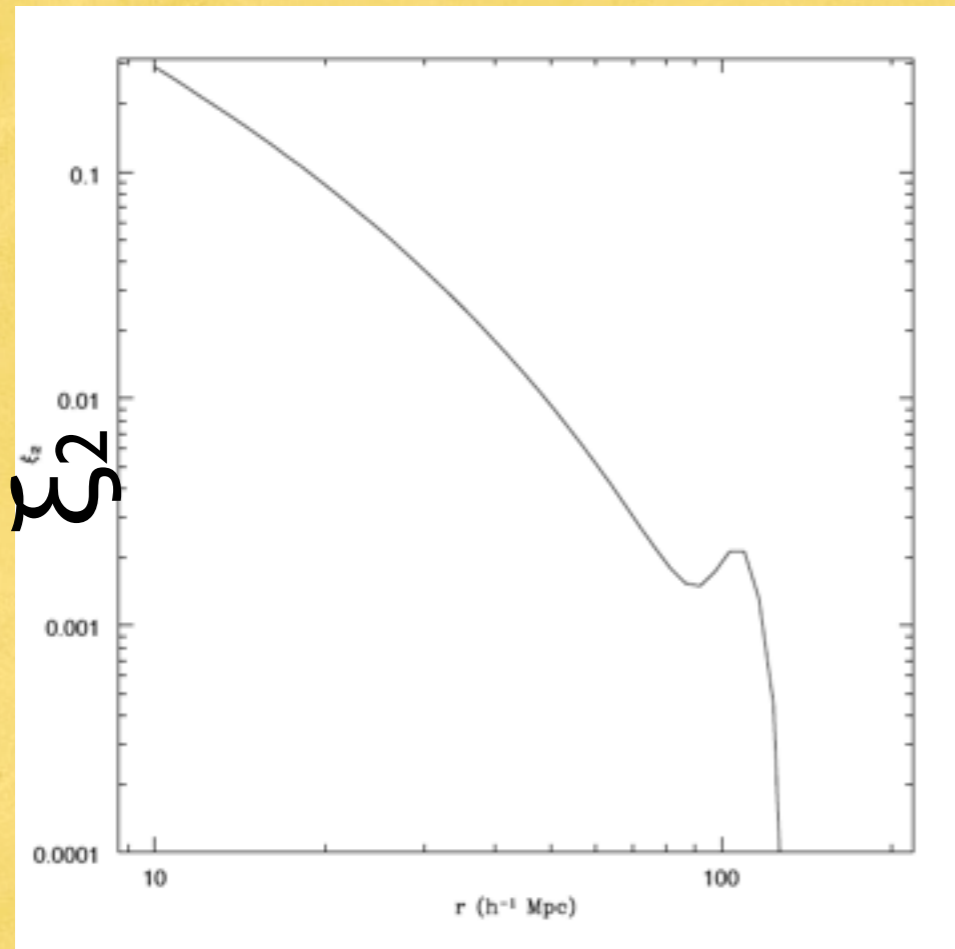
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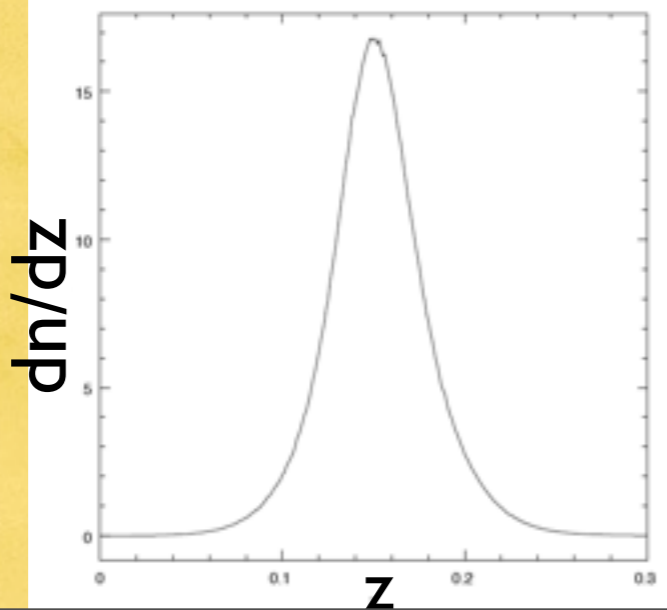
+  
 $dn/dz$



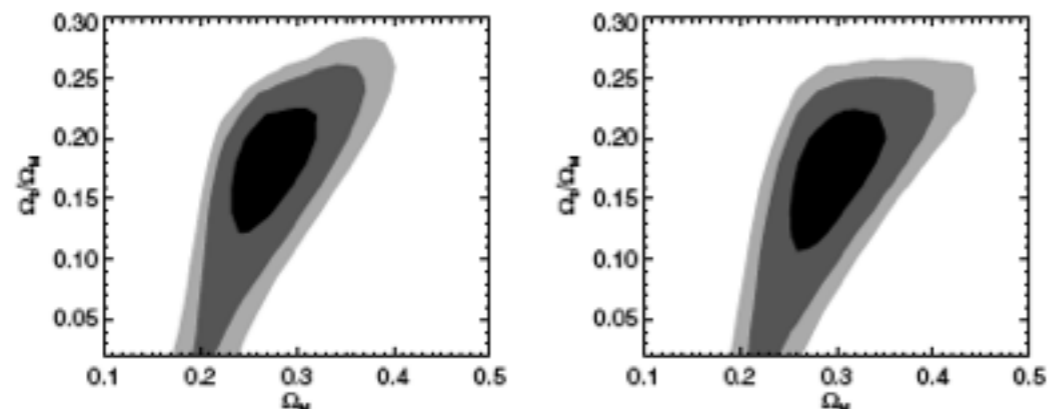
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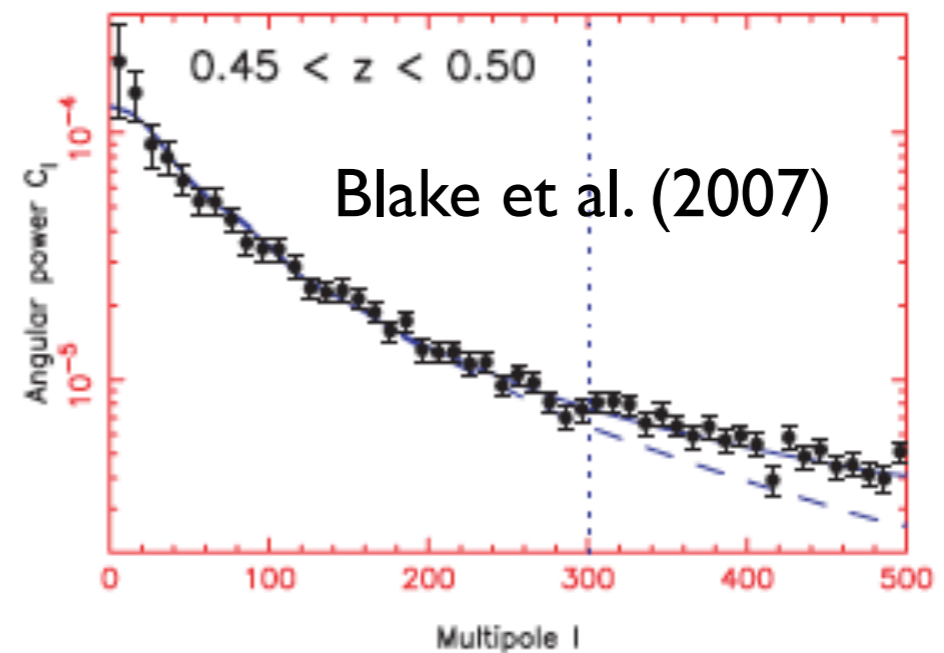
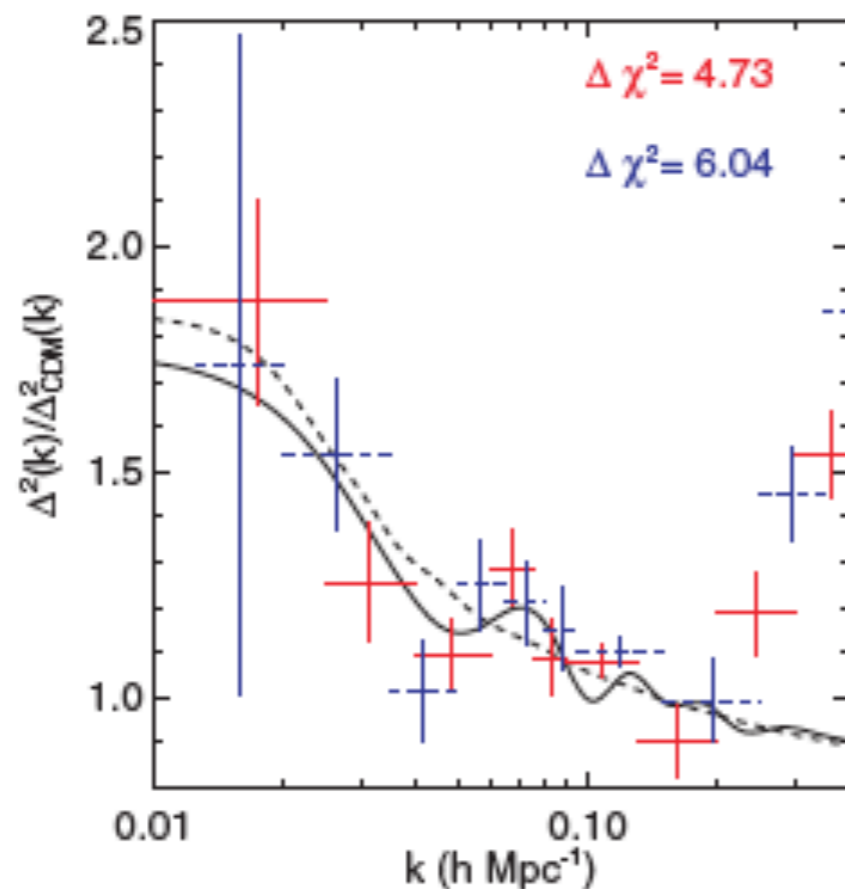
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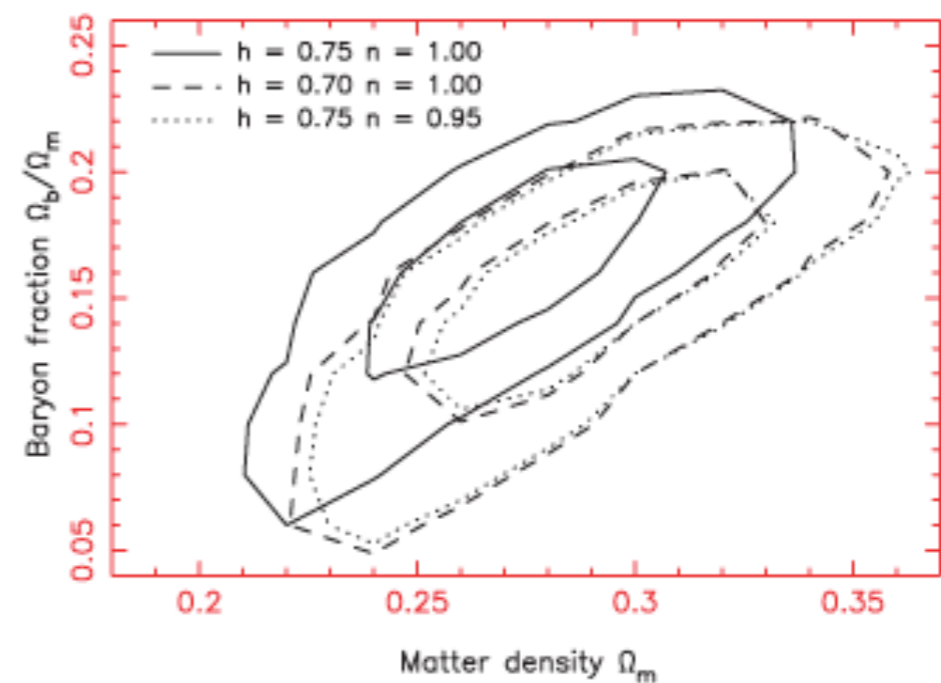
# SDSS Results



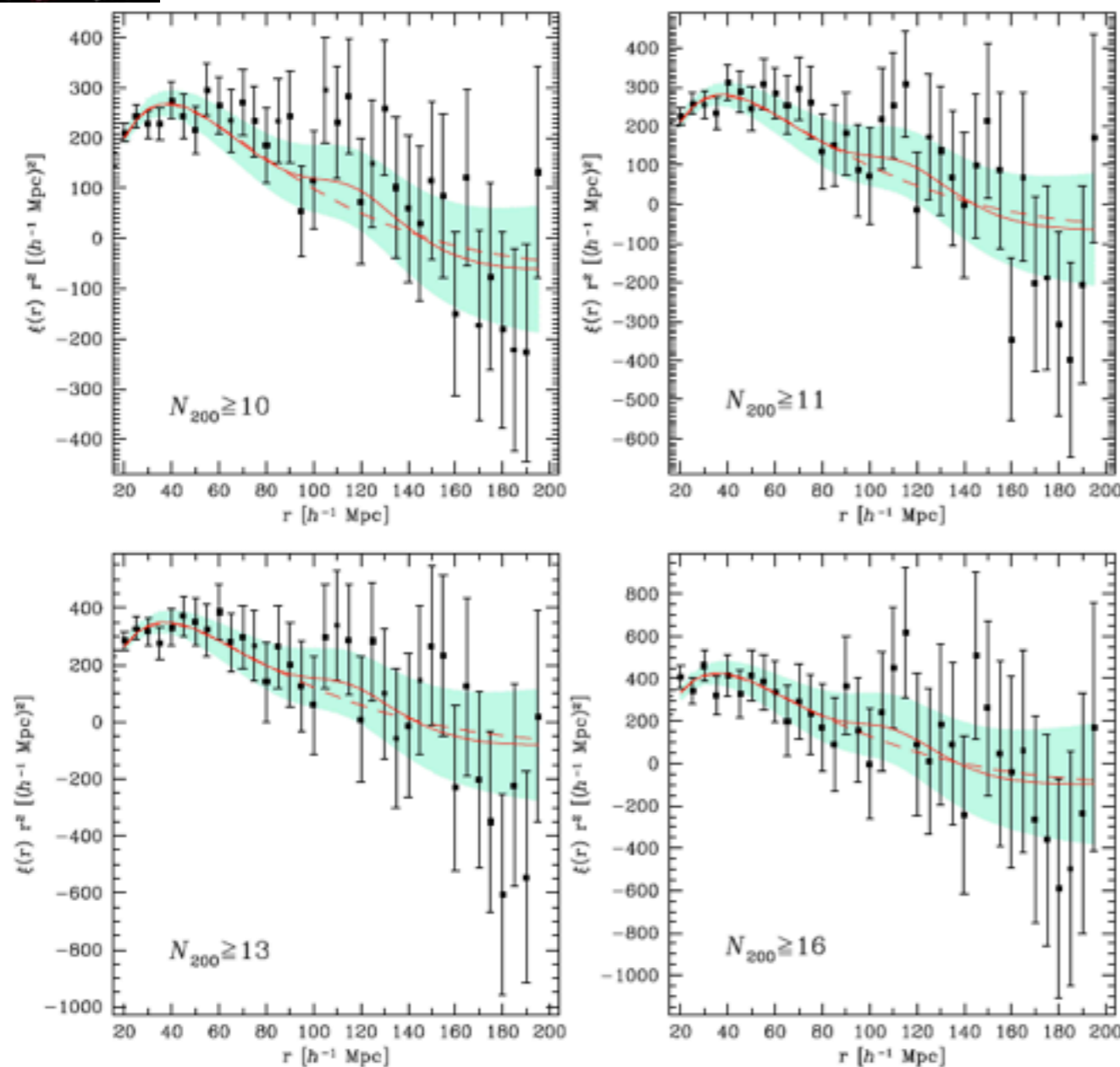
Padmanabhan et al. (2007)



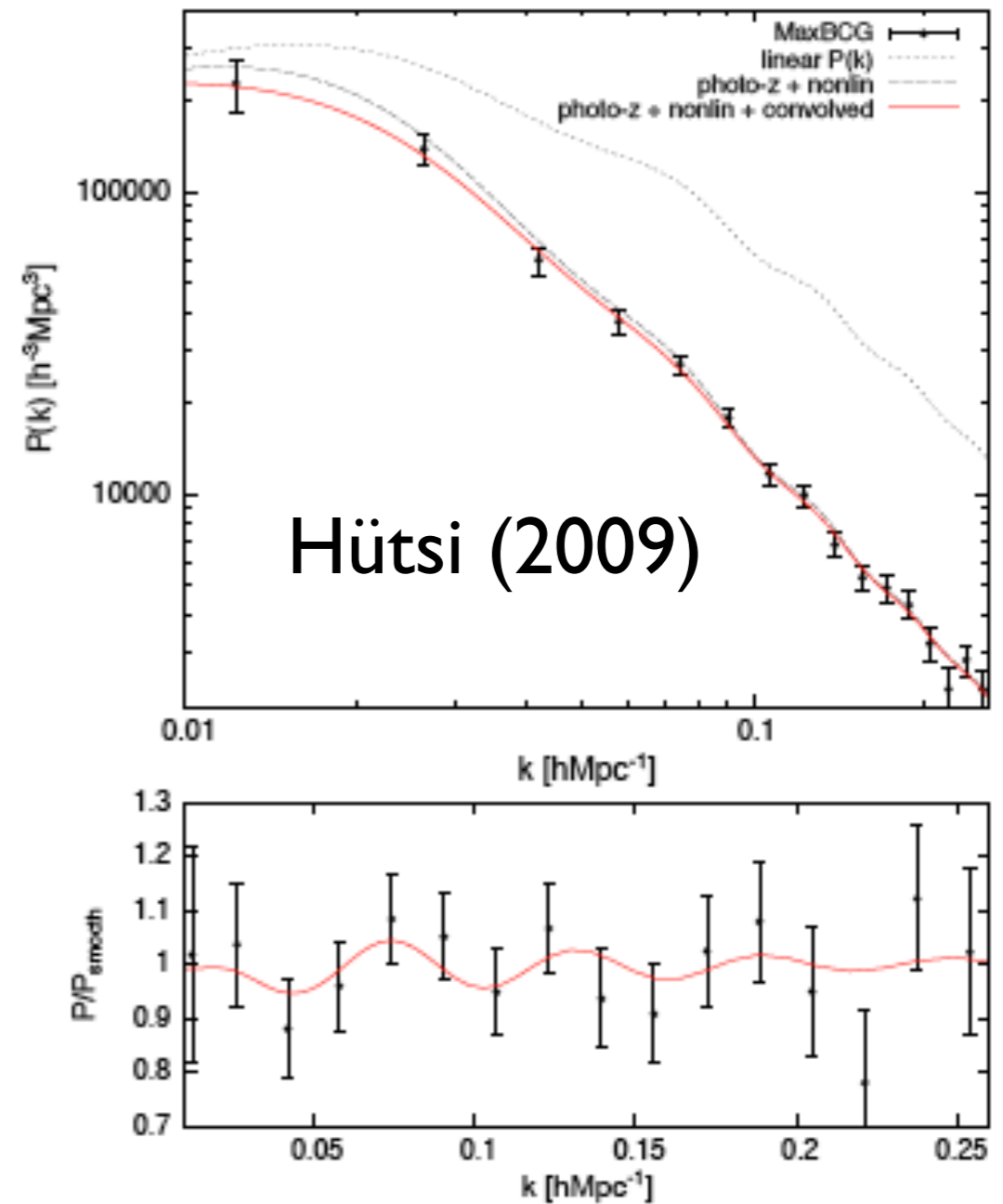
Blake et al. (2007)



# SDSS Results



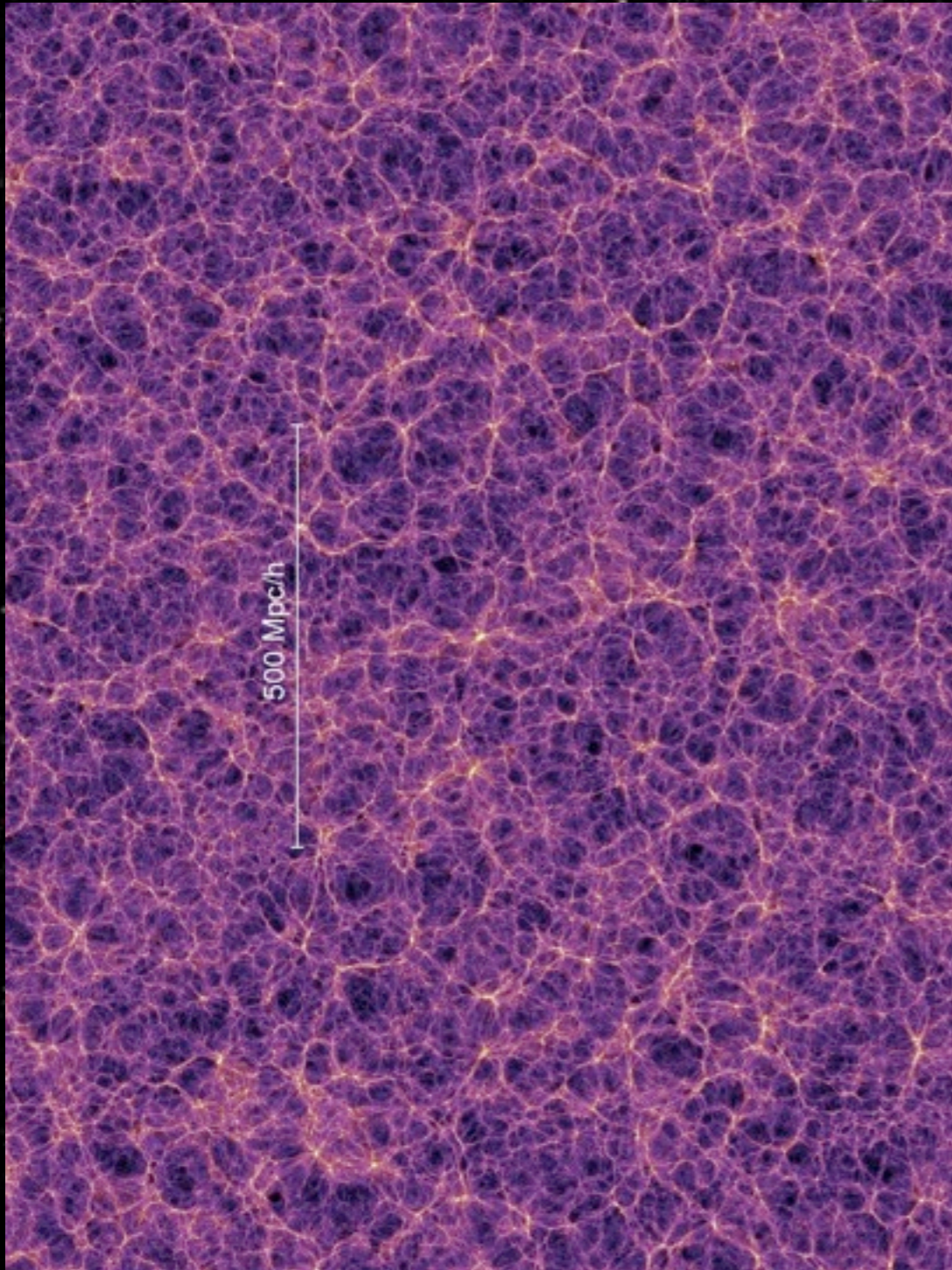
Estrada et al. (2009)



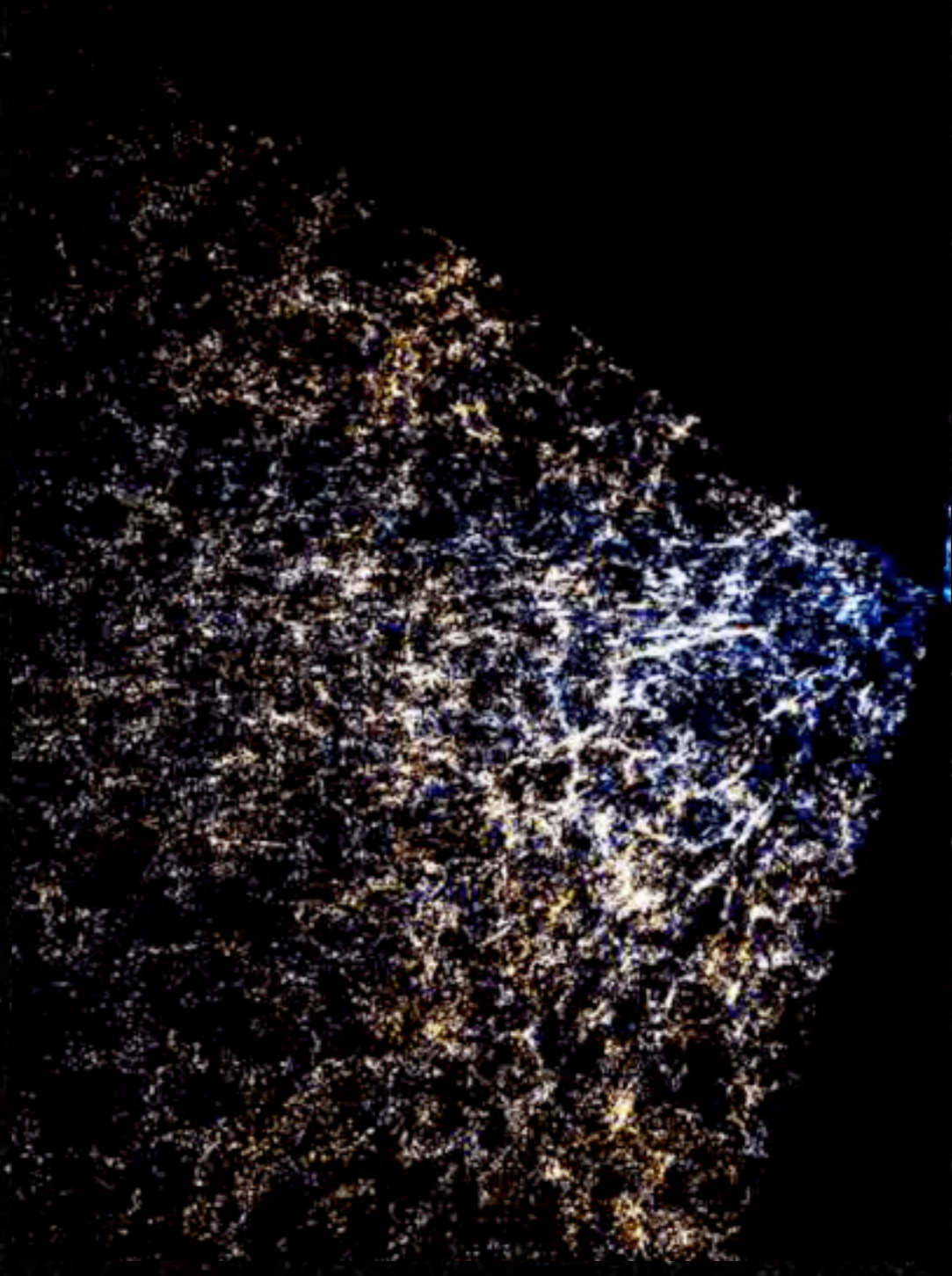
Hütsi (2009)

# Dark Matter Vs. Galaxies

Dark Matter (Millennium)



Galaxies (SDSS)



# Bias

- Bias relates galaxy clustering to dark matter clustering
- Local bias model:

$$\delta_g = F(\delta_{\text{DM}}) \Rightarrow \delta_g = b_1 \delta_{\text{DM}} + 0.5b_2 \delta_{\text{DM}}^2 + O(\delta_{\text{DM}}^3)$$

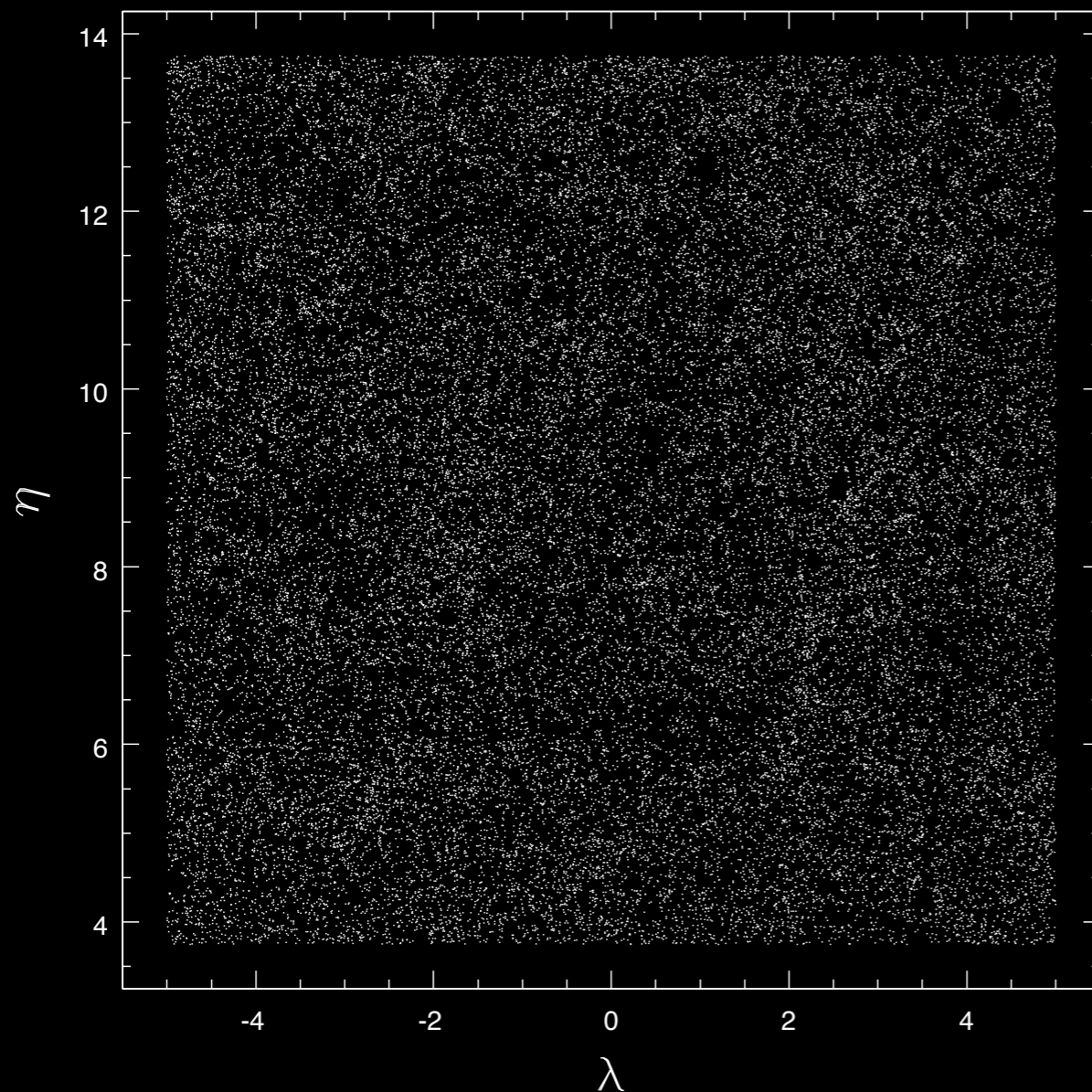
- **For**  $r_{\text{eq}} \gtrsim 10h^{-1}\text{Mpc}$ :

$$\omega_2 \cong b_1^2 \omega_{2,\text{DM}}$$

# Bias depends on Colour

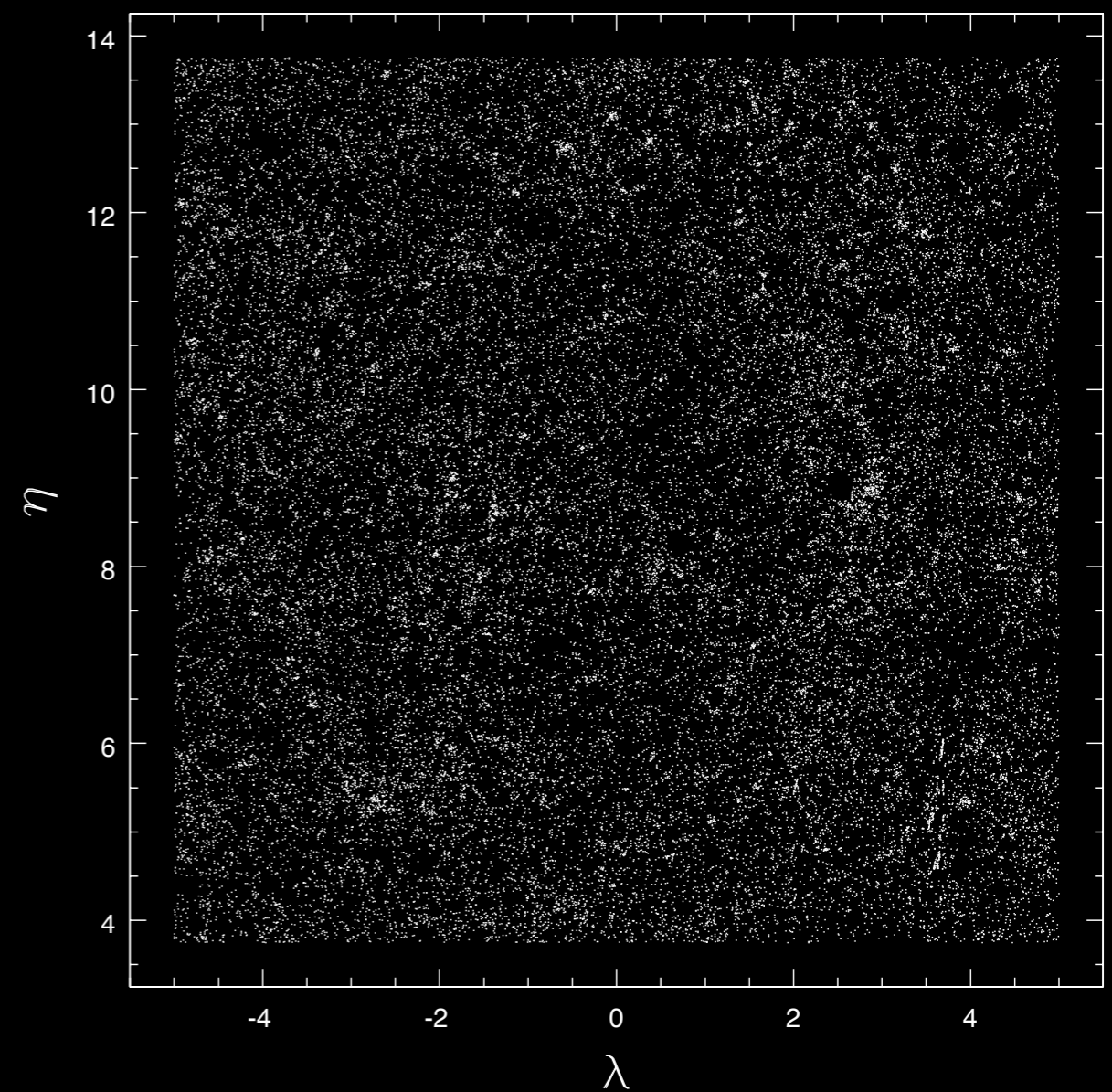
- Red (early-type) galaxies more clustered than blue (late-type) galaxies
- Red found in clusters, more blue in field
- Bias much larger for early-type

# Bias depends on Colour



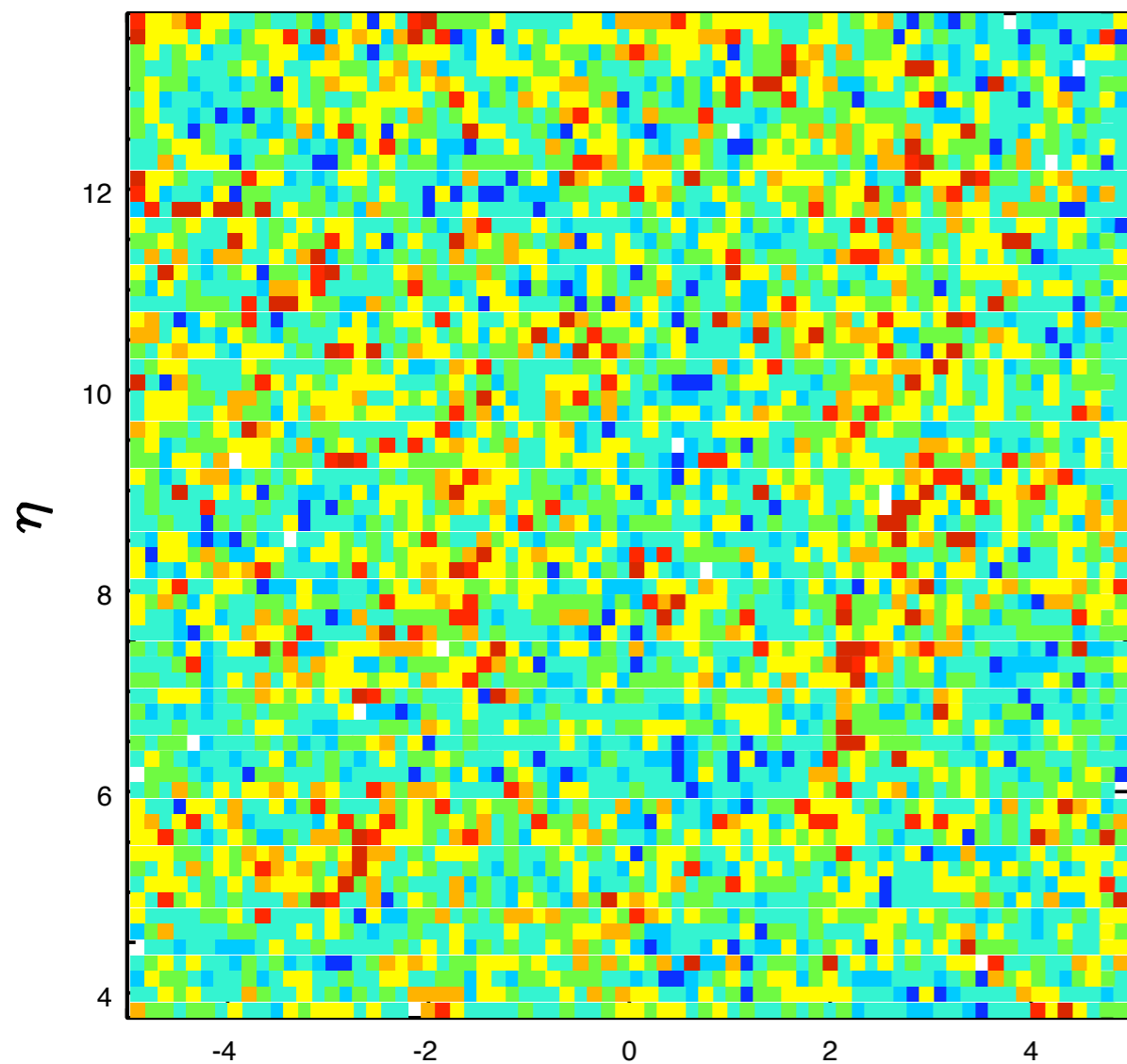
Blue  
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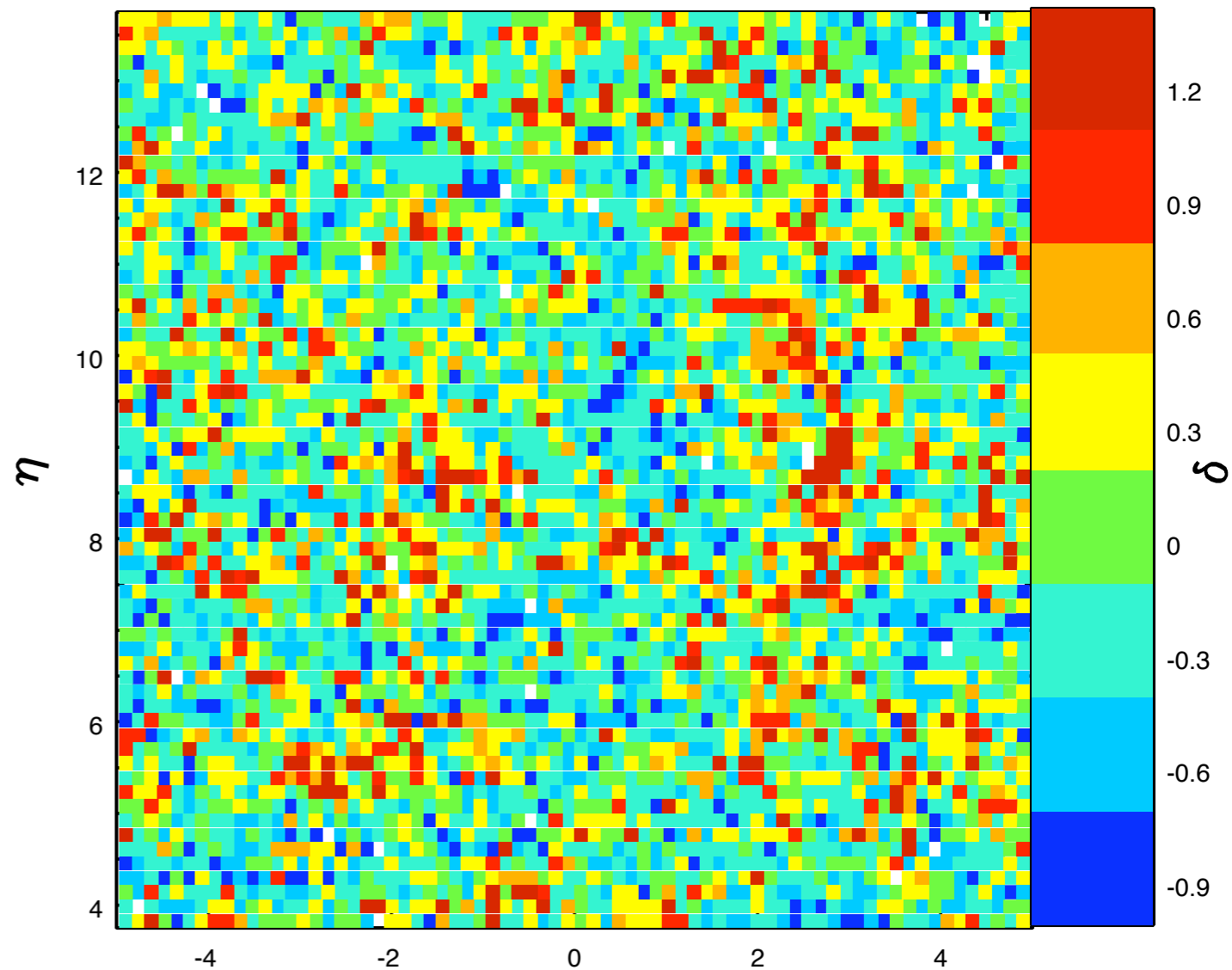
Red  
April 1st, 2011

# Bias depends on Colour



$\lambda$   
Blue

Ashley J Ross



$\lambda$   
Red

LBNL

April 1st, 2011

# Bias - Mass

- Galaxies exist in dark matter halos
- Clustering is due simply to gravity
- Galaxy bias should depend on the mass of the halos the galaxies occupy
- bias of galaxies relates to local environment

# Model Correlation Functions

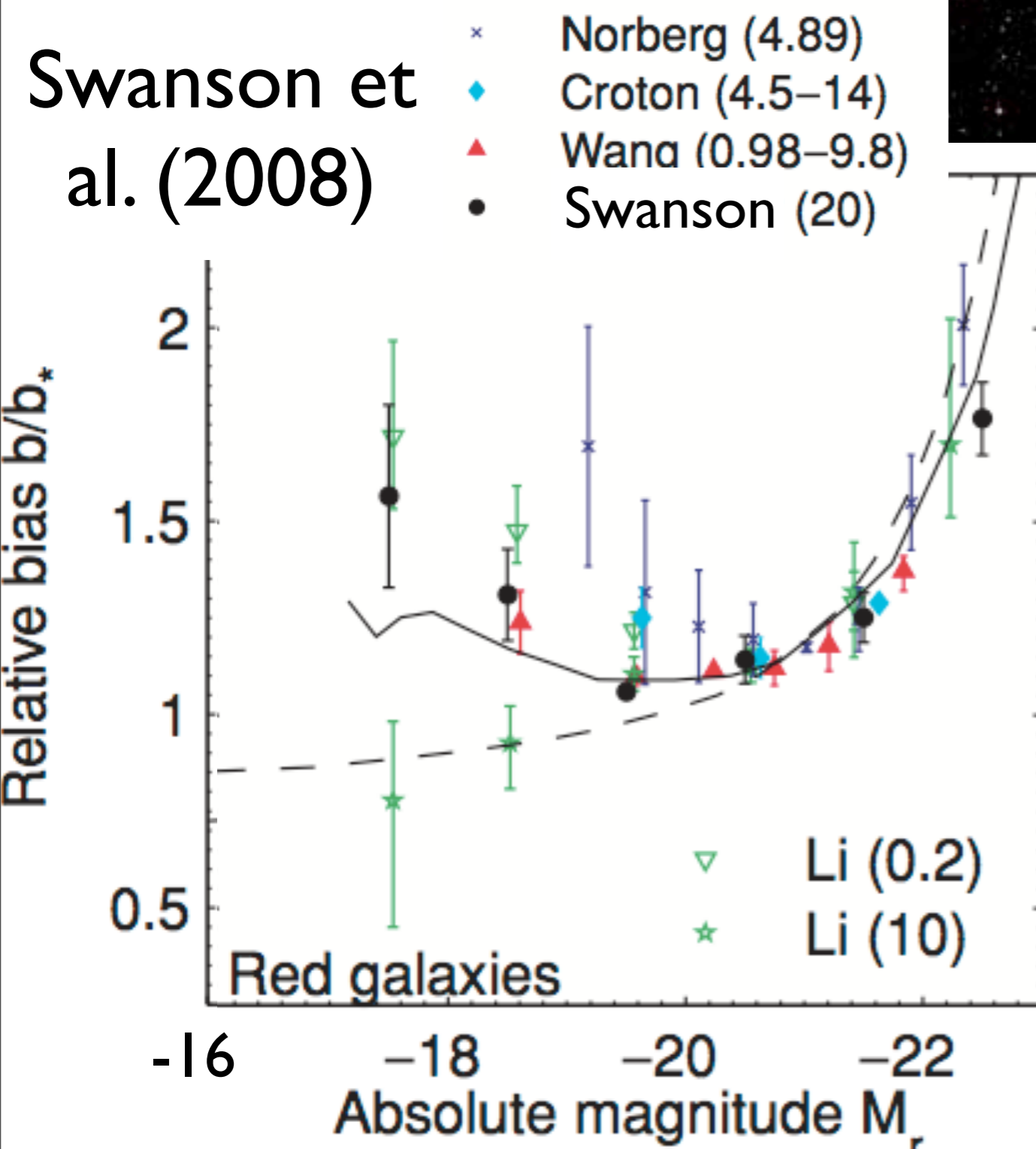
- redshift space correlation function (Halofit w/ linear RSD)
- $w(\theta)$ , project over  $n(z)$

$$w(\theta) = \int dz_1 \int dz_2 n(z_1) n(z_2) \xi^s(\mu, r_{ev}(\theta, z_1, z_2))$$

$$r_{ev}(\theta, z_1, z_2) = \sqrt{\chi^2(z_1) + \chi^2(z_2) - 2\chi(z_1)\chi(z_2)\cos\theta}$$

$$\mu = (\chi(z_1) - \chi(z_2))/r_{ev}$$

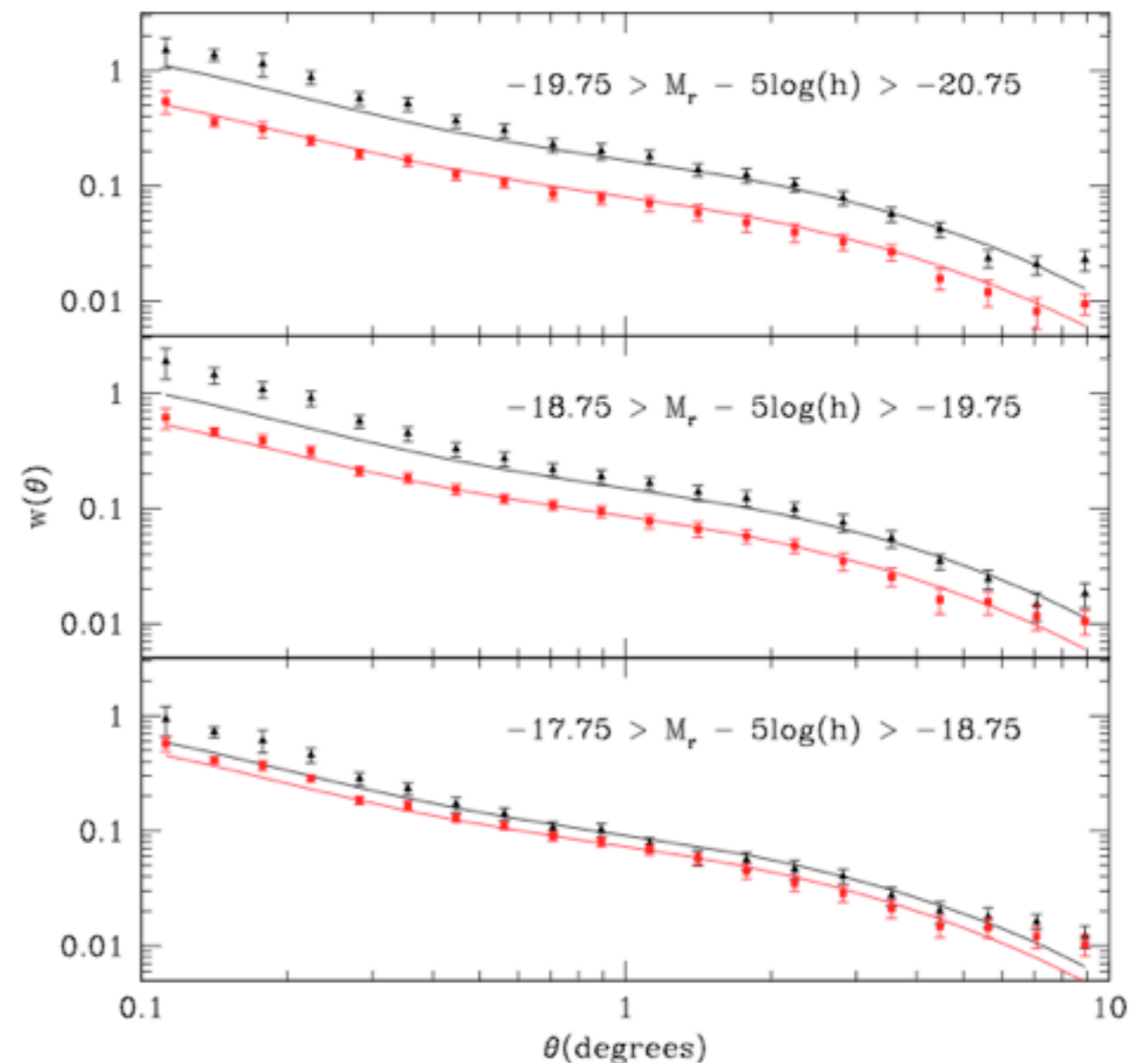
# Red Galaxy Bias



- Implies low luminosity red galaxies ~ exclusively satellites
- Other studies (groups, LRG cross-correlations) inconsistent

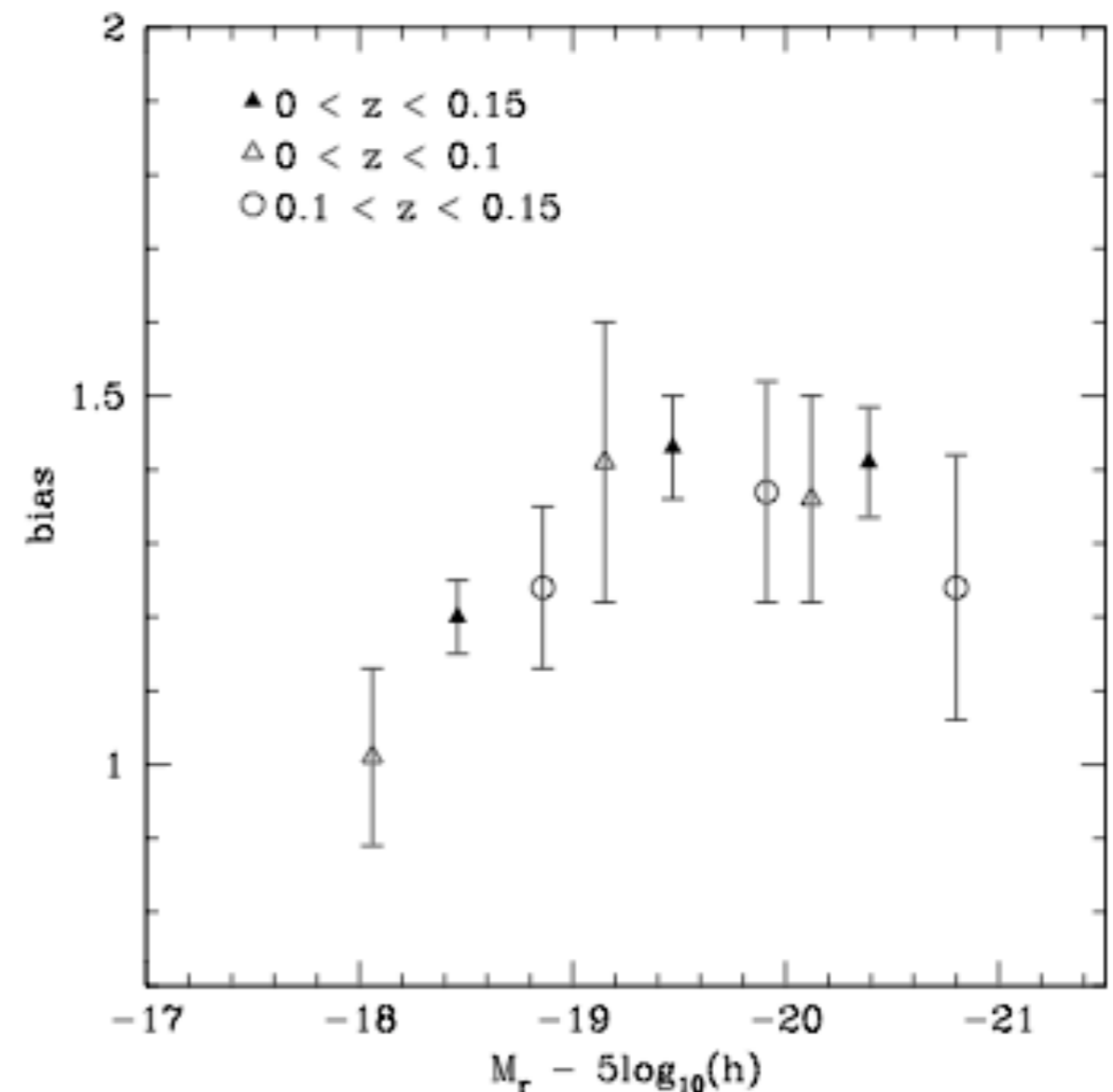
# SDSS DR7 Photometric Galaxies

- $z_{\text{phot}} < 0.1$ ,  $r < 20$ ,  $M_r < -17.75$ ,  $u-r > 2.2$ ,  $g-r > 0.8$
- auto-correlations, cross-correlations with  $z < 0.15$  ( $z < 0.1$ ,  $0.1 < z < 0.15$ ) spectroscopic samples
- bias relation robust to changes in color selection, photozs, etc.



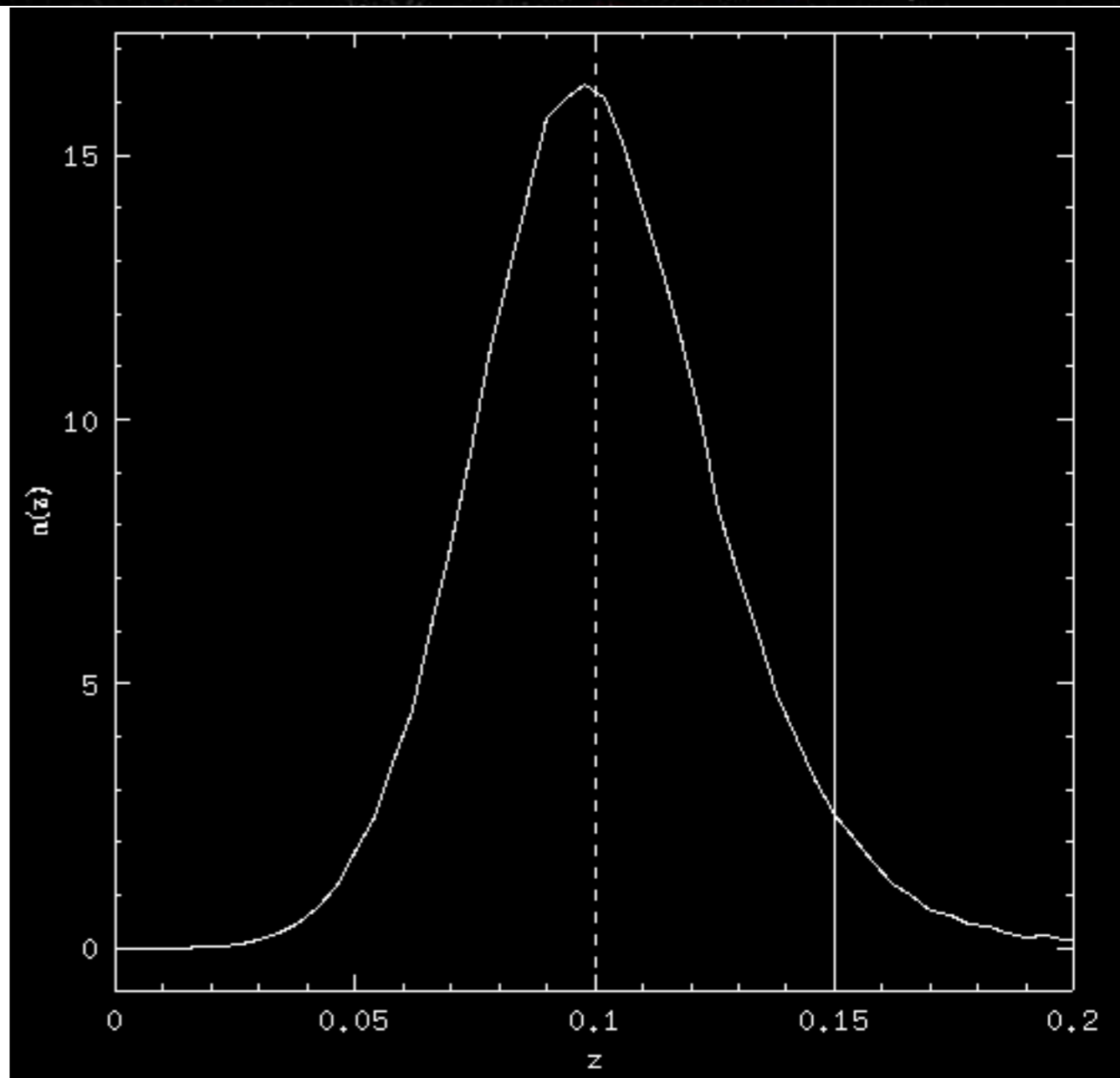
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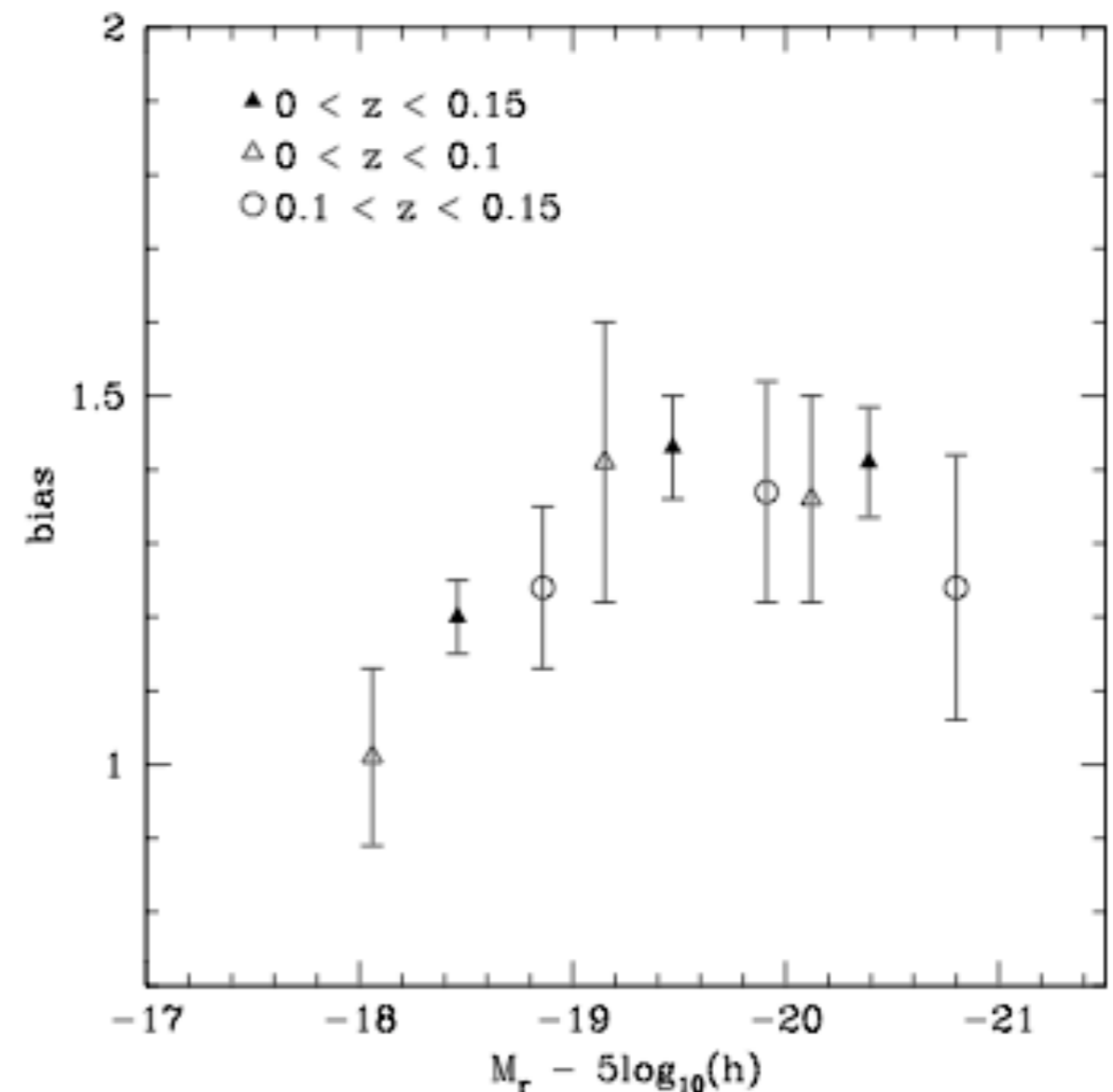
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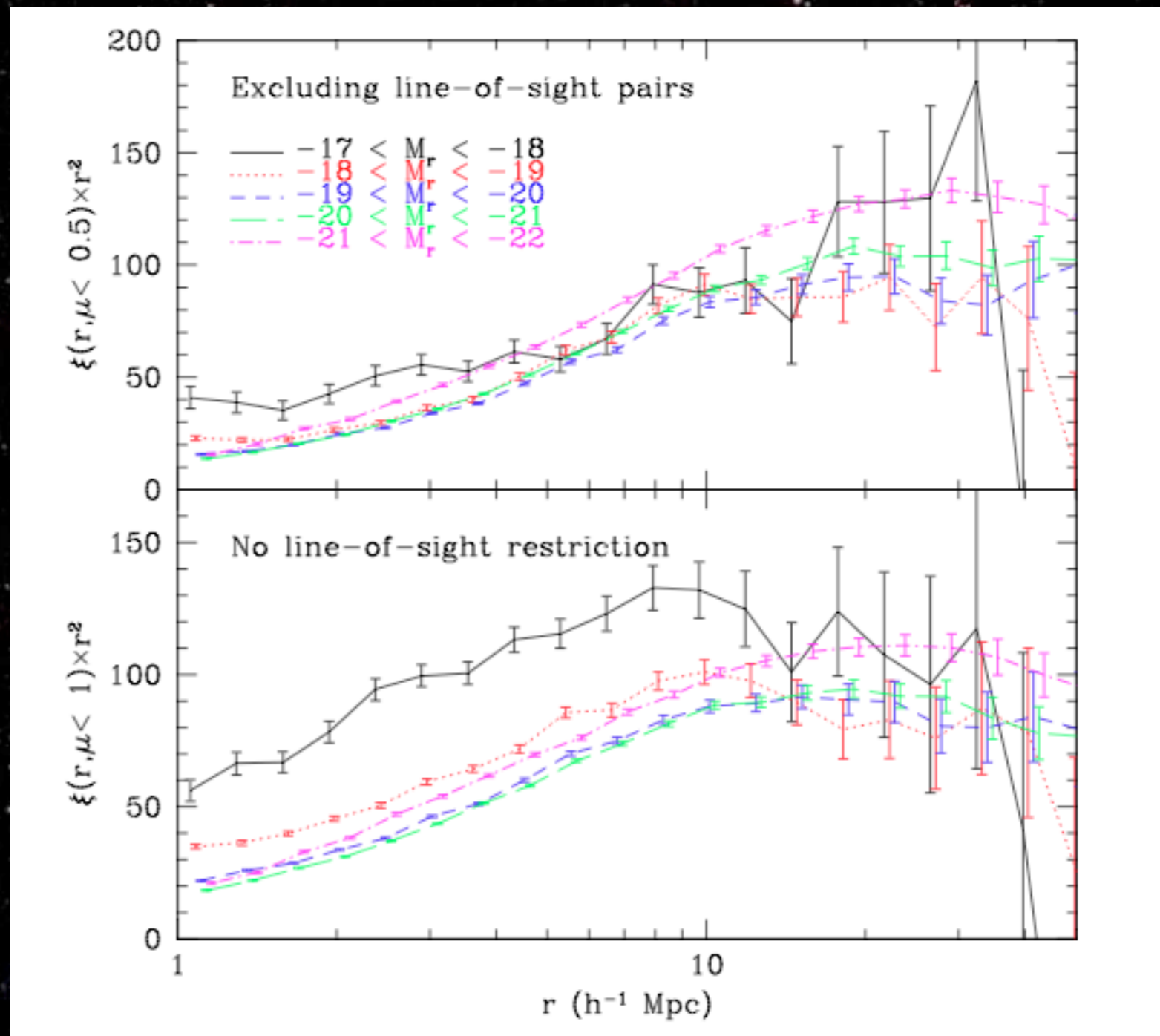
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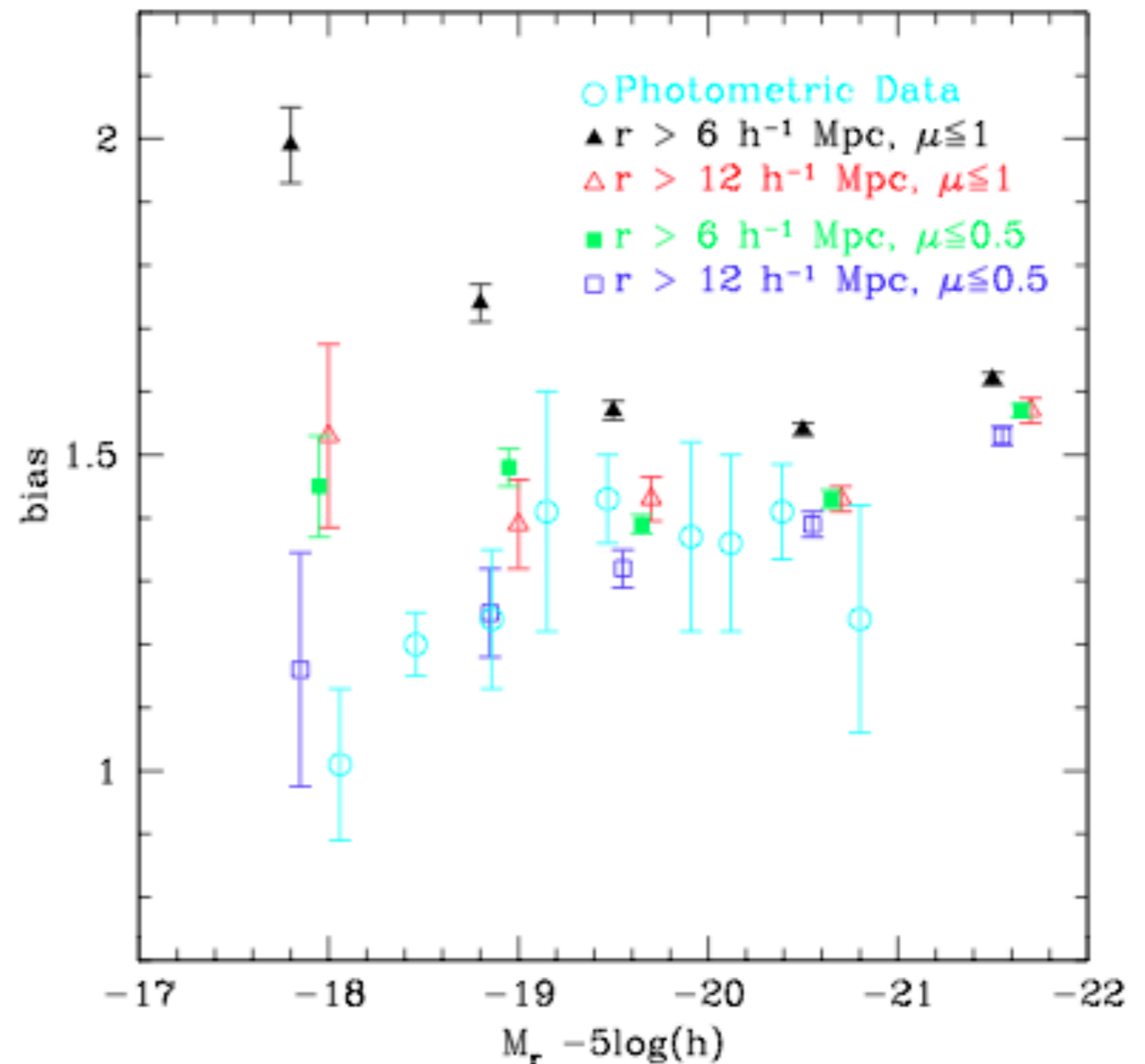
# DR7 Spectroscopic Galaxies

- Strong dependence on angle to line-of-sight & scale



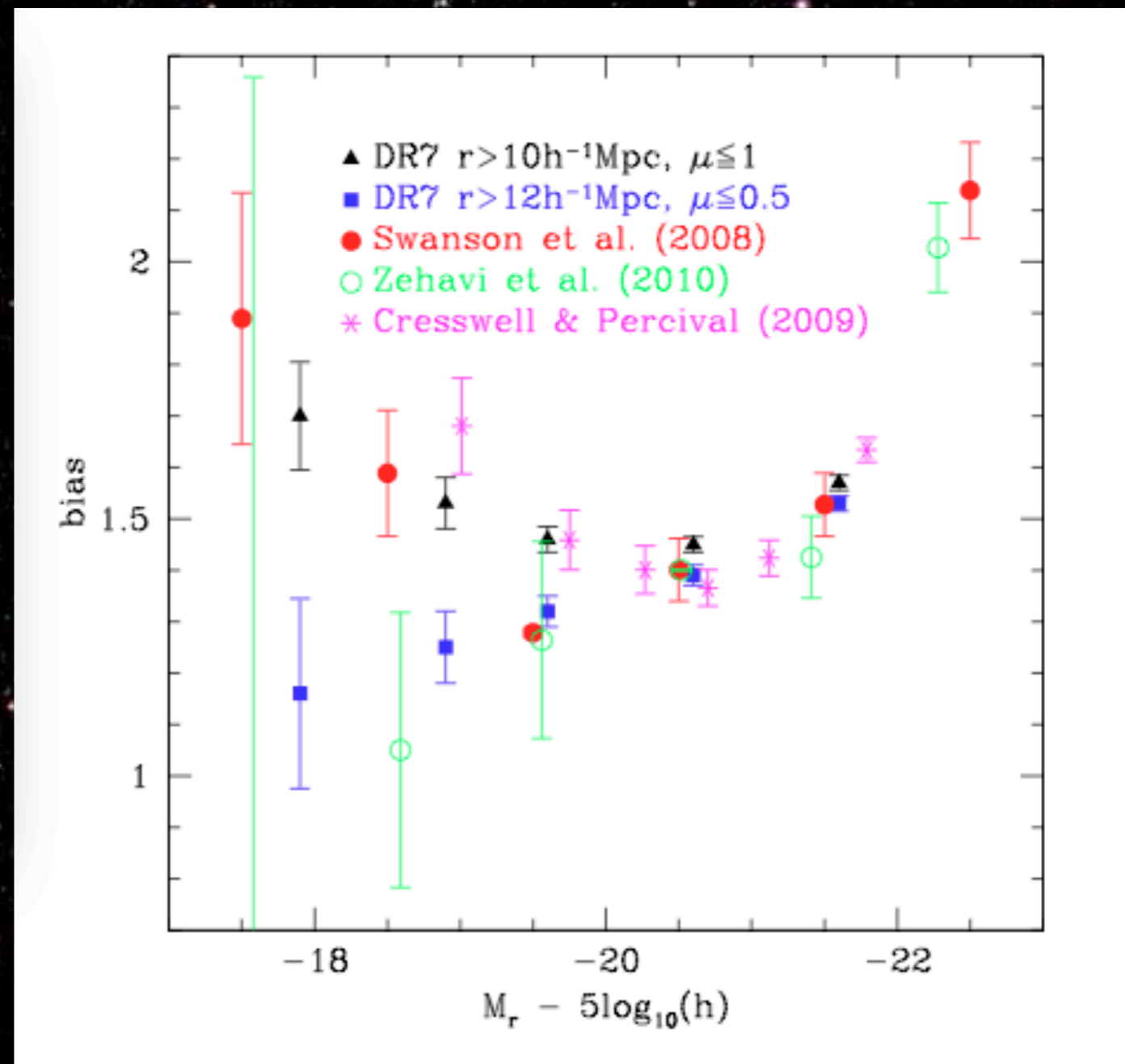
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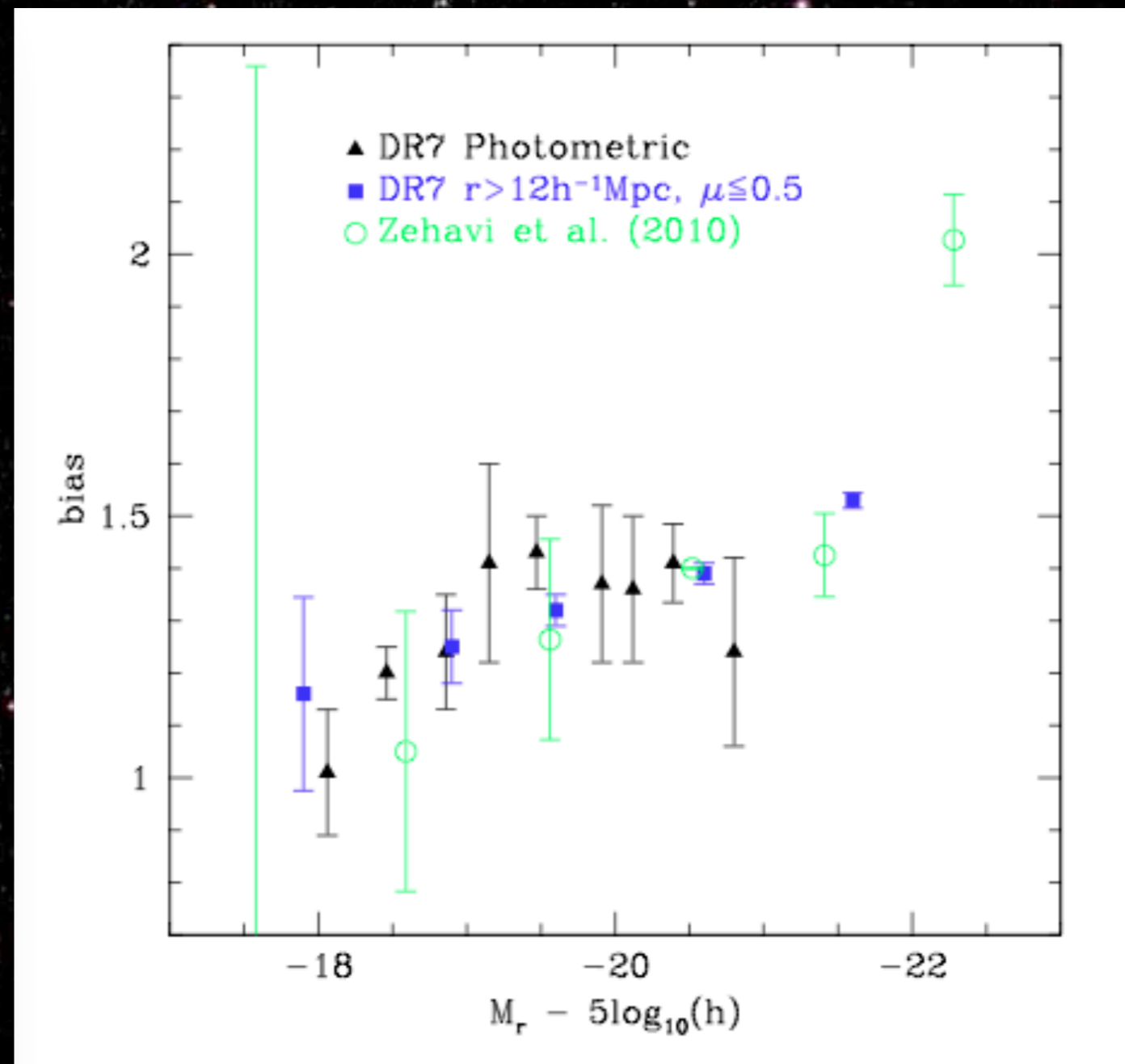
# Implications

- Previous results recovered for small-scales and low clustering
- Most robust (large volume, minimal low contribution) -> monotonic increase in bias with luminosity



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- Most robust (large volume, minimal low contribution) -> monotonic increase in bias with luminosity



# SDSS HOD modeling with photozs

- Huge SDSS data set allows precise  $\omega_2$  measurements - ideal for testing model
- Clustering measurements complementary to spectroscopic (larger range of scales, redshift range)

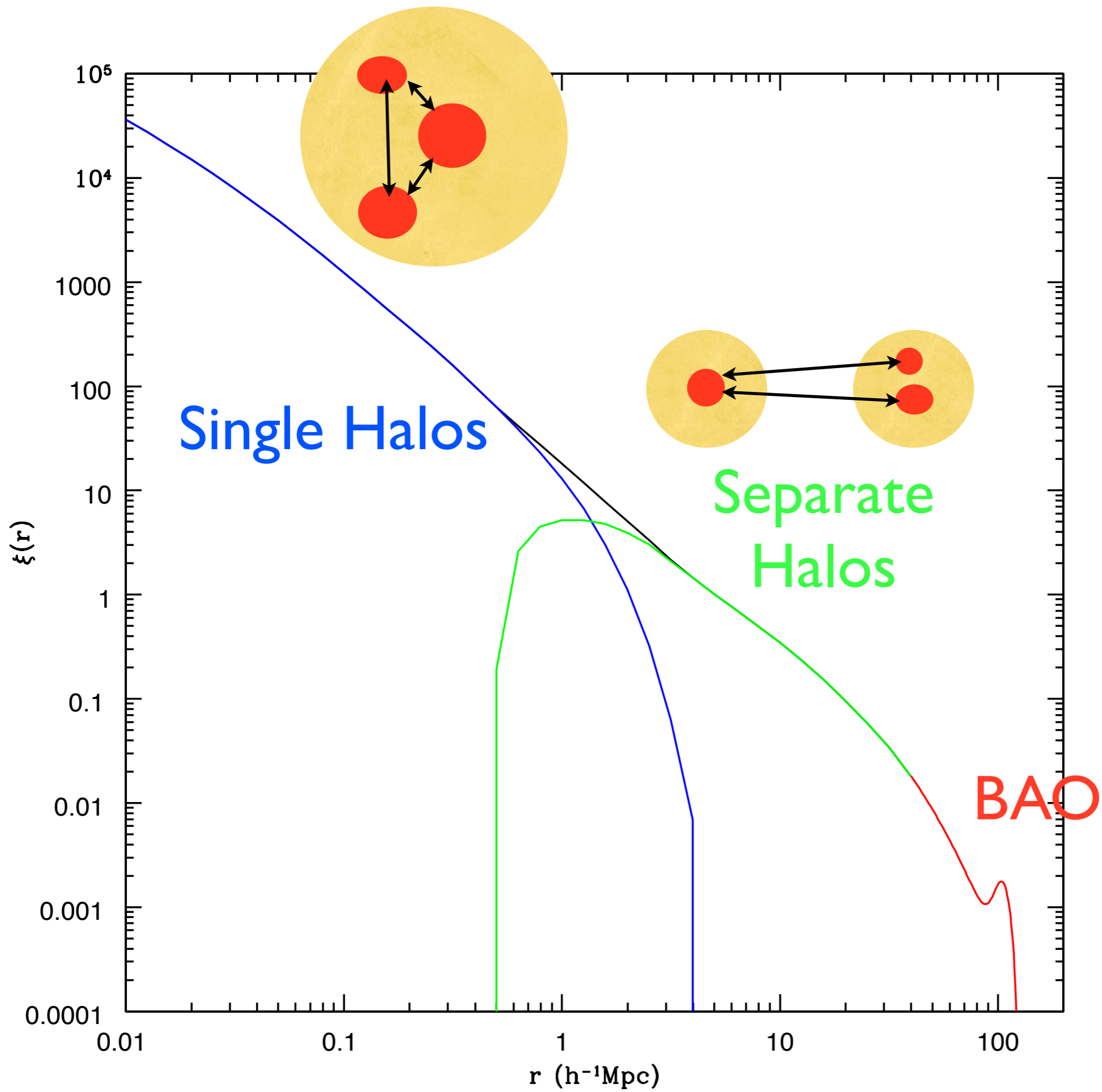
# HOD Modeling

- Given model for DM halo number density as function of mass and redshift
- Model  $P(k)$  by modeling mean occupation of galaxies in dark matter halos

$$N(M) = N_{cen}(M) \times (1 + N_{sat}(M))$$

- Two “1-halo” terms

$$P_{cs} = \int_{M_{vir}(r)}^{\infty} dM n(M) N_{cen}(M) \frac{2N_{sat}u(k|M)}{n_g^2}$$
$$P_{ss} = \int_{M_{vir}(r/2)}^{\infty} dM n(M) N_{cen}(M) \left( \frac{N_{sat}u(k|M)}{n_g} \right)^2$$



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# “2-halo” term

- Essentially, determines bias given HOD model:

$$P_{2h}(k, r) = P_{matter}(k) \times \left[ \int_0^{M_{lim}(r)} dM n(M) b(M, r) \frac{N(M)}{n'_g} u(k|M) \right]^2$$

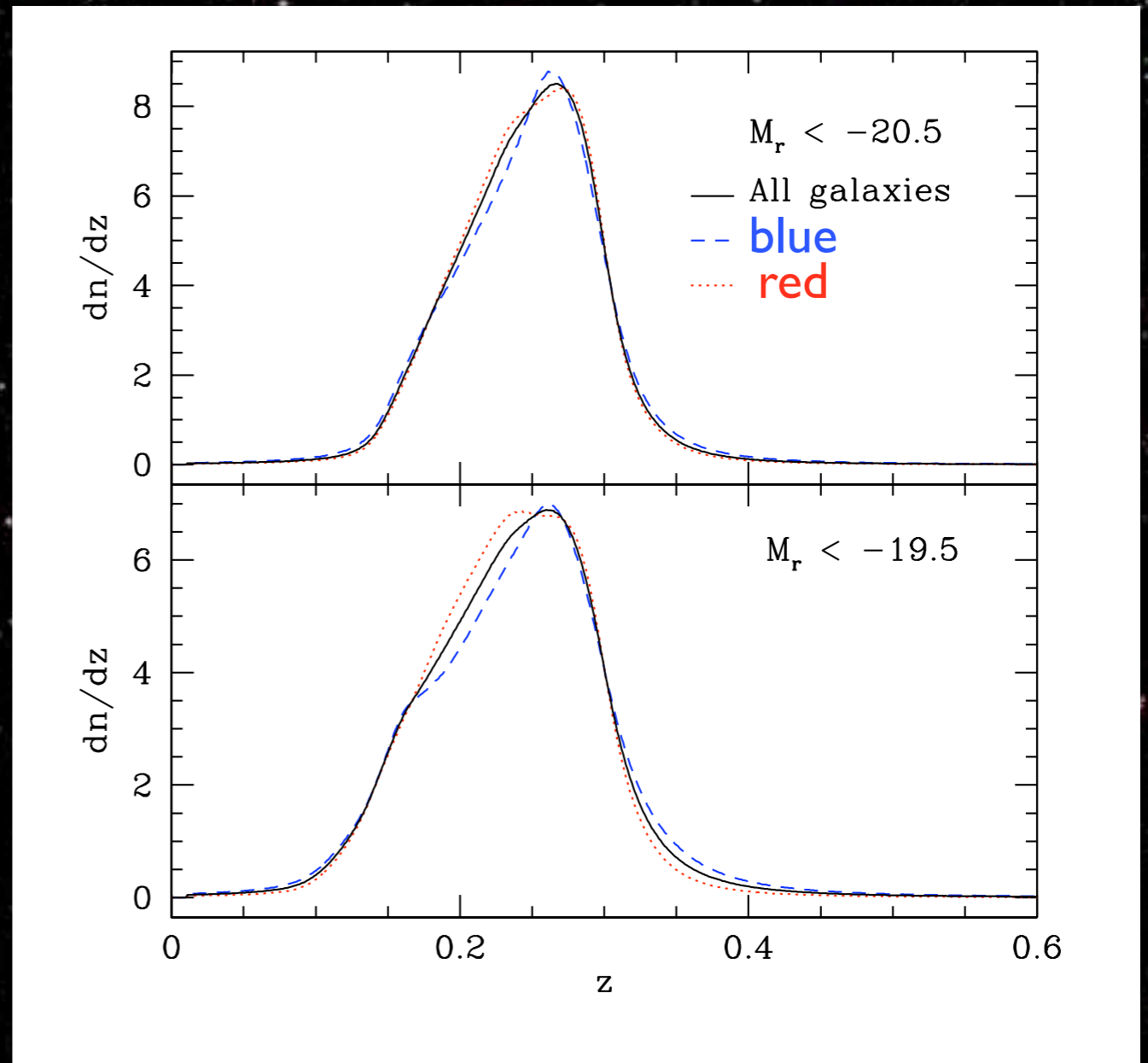
- so  $P(k, r) = P_{cs}(k) + P_{ss}(k) + P_{2h}(k, r) \Rightarrow$

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

$$\omega_2(\theta) = \frac{2}{c} \int_0^\infty dz H(z) (dn/dz)^2 \int_0^\infty du \xi(r = \sqrt{u^2 + x^2(z)} \theta^2)$$

# SDSS DR5 Galaxies

- Template based  
 $z_{phot} < 0.3$
- Two samples;  
 $M_r - 5\log h < -19.5$   
(~4 million galaxies),  
 $< -20.5$  (~1.3 million galaxies)
- Split into red/blue samples via type value



# HOD constraints with SDSS DR5 Galaxies

- HOD model:

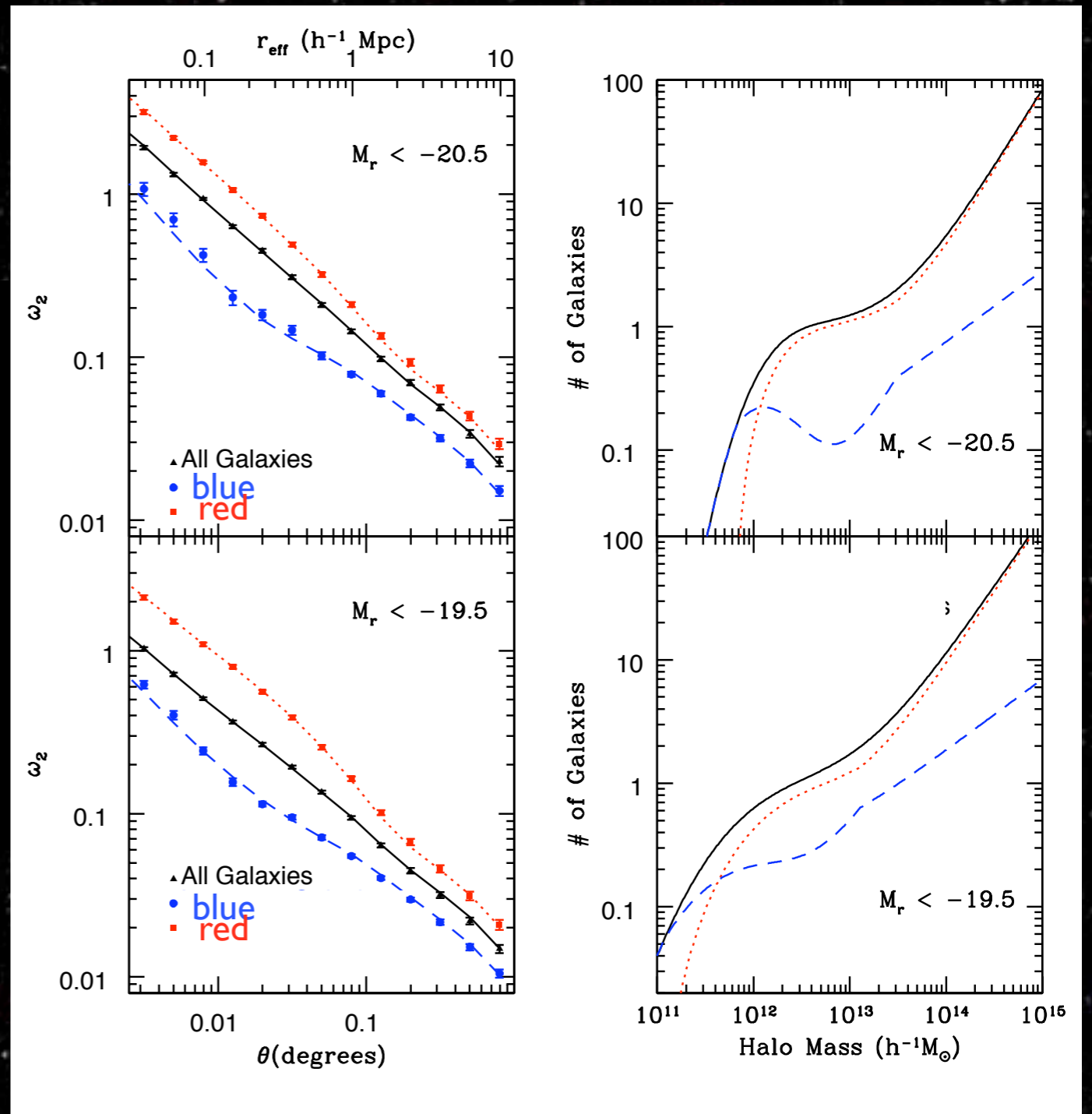
$$\langle N_c | M \rangle = 0.5 \left( 1 + \operatorname{erf} \left( \frac{M/M_{cut}}{\sigma_{cut}} \right) \right)$$

$$\langle N_s | M \rangle = 0.5 \left( 1 + \operatorname{erf} \left( \frac{M/M_{cut}}{\sigma_{cut}} \right) \right) \times (M/M_0)^\alpha$$

$$\langle N_c | M \rangle_{late} = \langle N_c | M \rangle \times f_{c0} \exp \left( \frac{-\log_{10}(M/M_{cut})}{\sigma_c} \right)$$

$$\langle N_s | M \rangle_{late} = \langle N_s | M \rangle \times f_{s0} \exp \left( \frac{-\log_{10}(M/M_0)}{\sigma_s} \right)$$

- +Segregation of blue/red galaxies



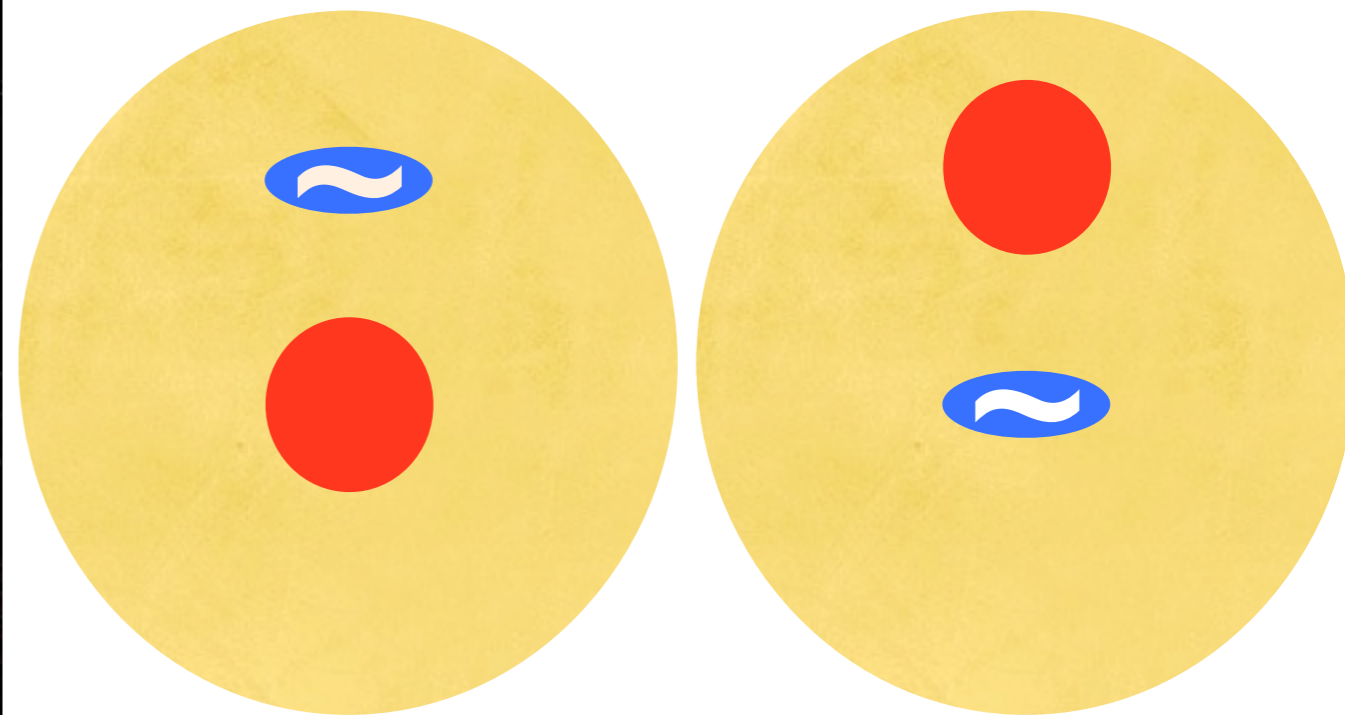
# Red/blue Model

- New modeling for red/blue galaxies
- Place galaxies into separate halos as much as statistics allow
- Means  $\sim$  no mixing in low mass halos, some mixing in high mass halos

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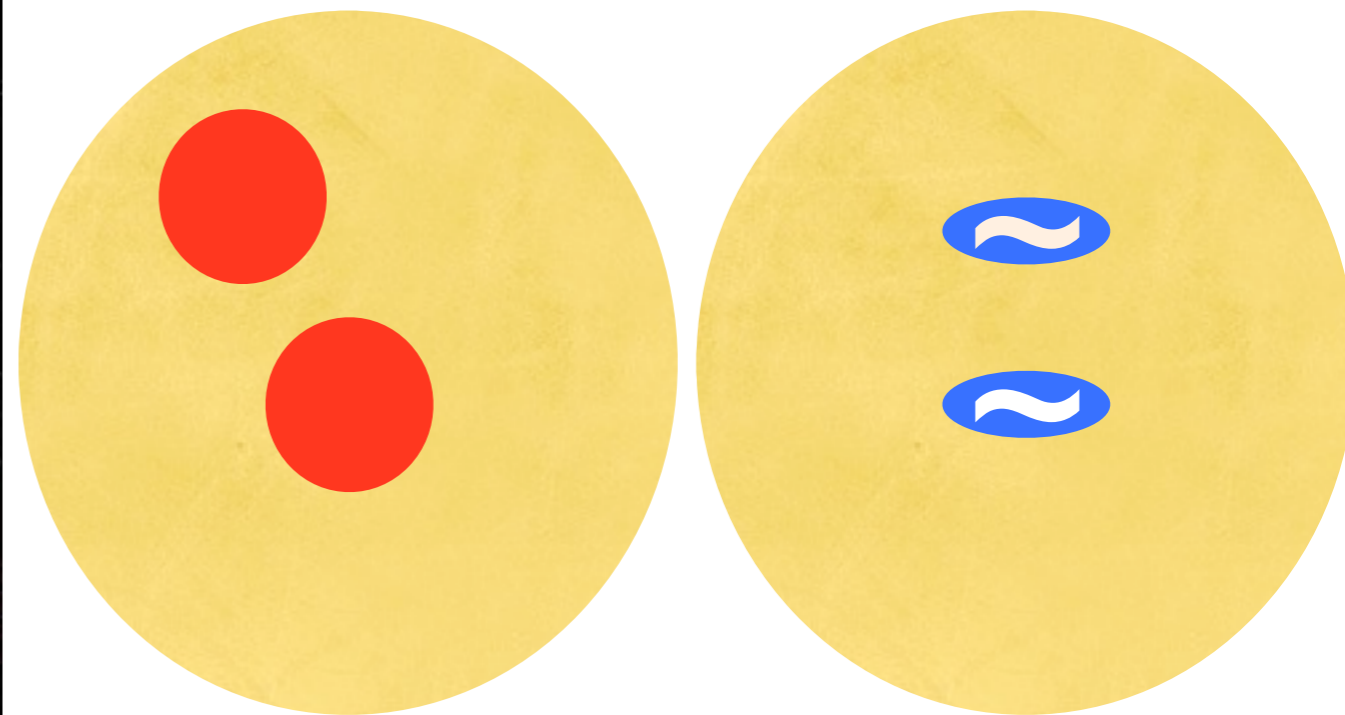
Mixing (old model)



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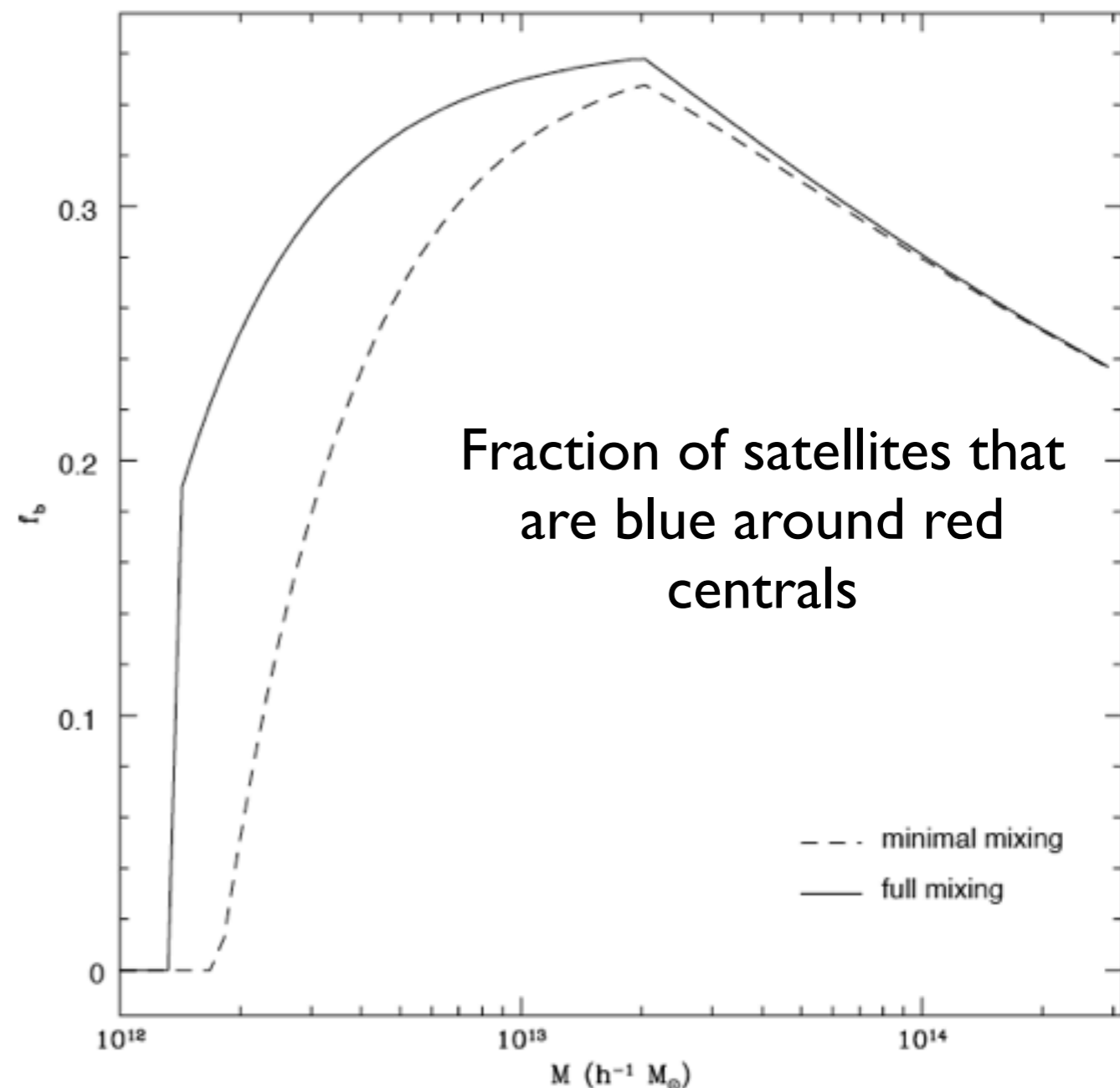
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Minimal mixing

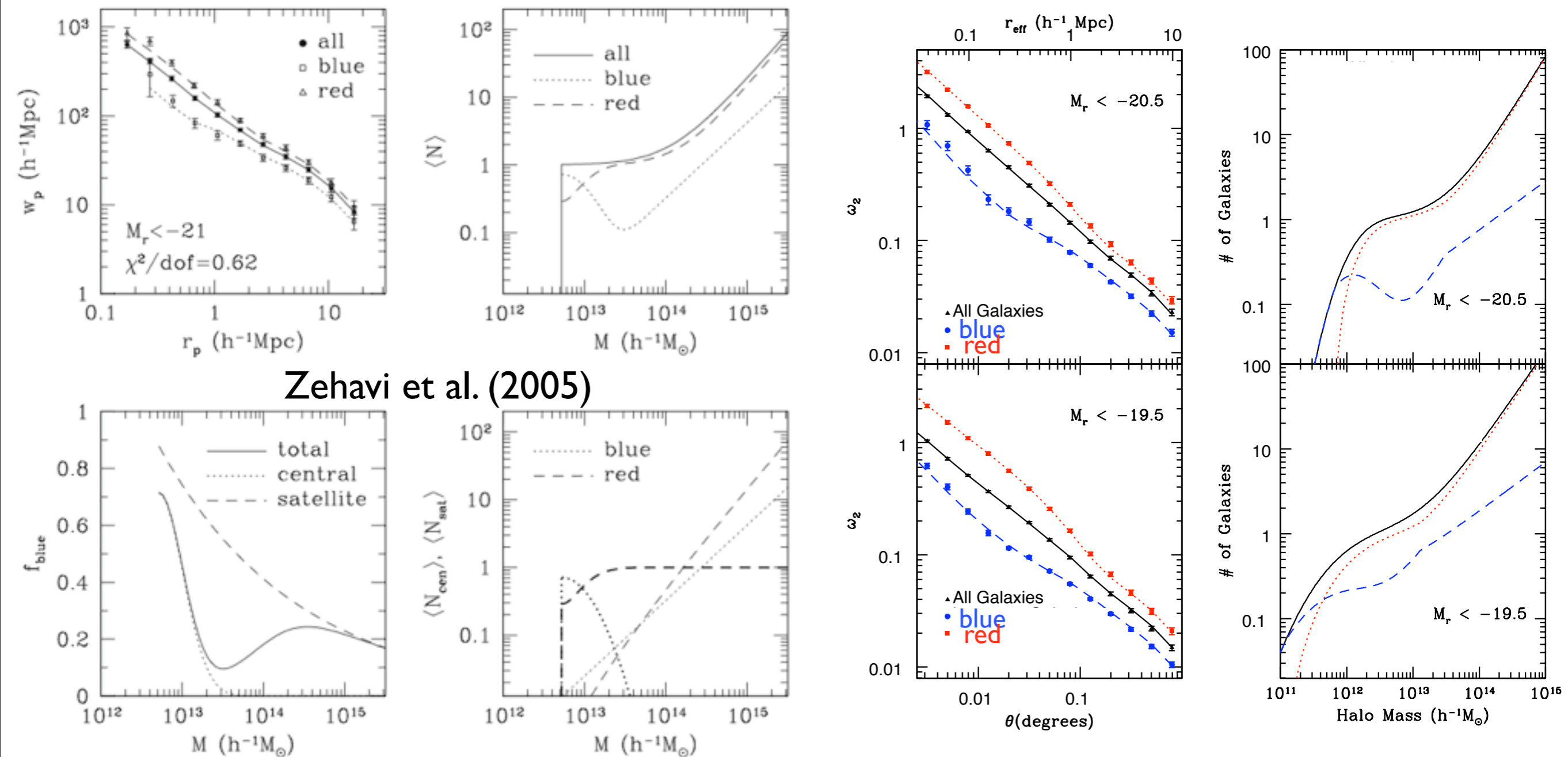


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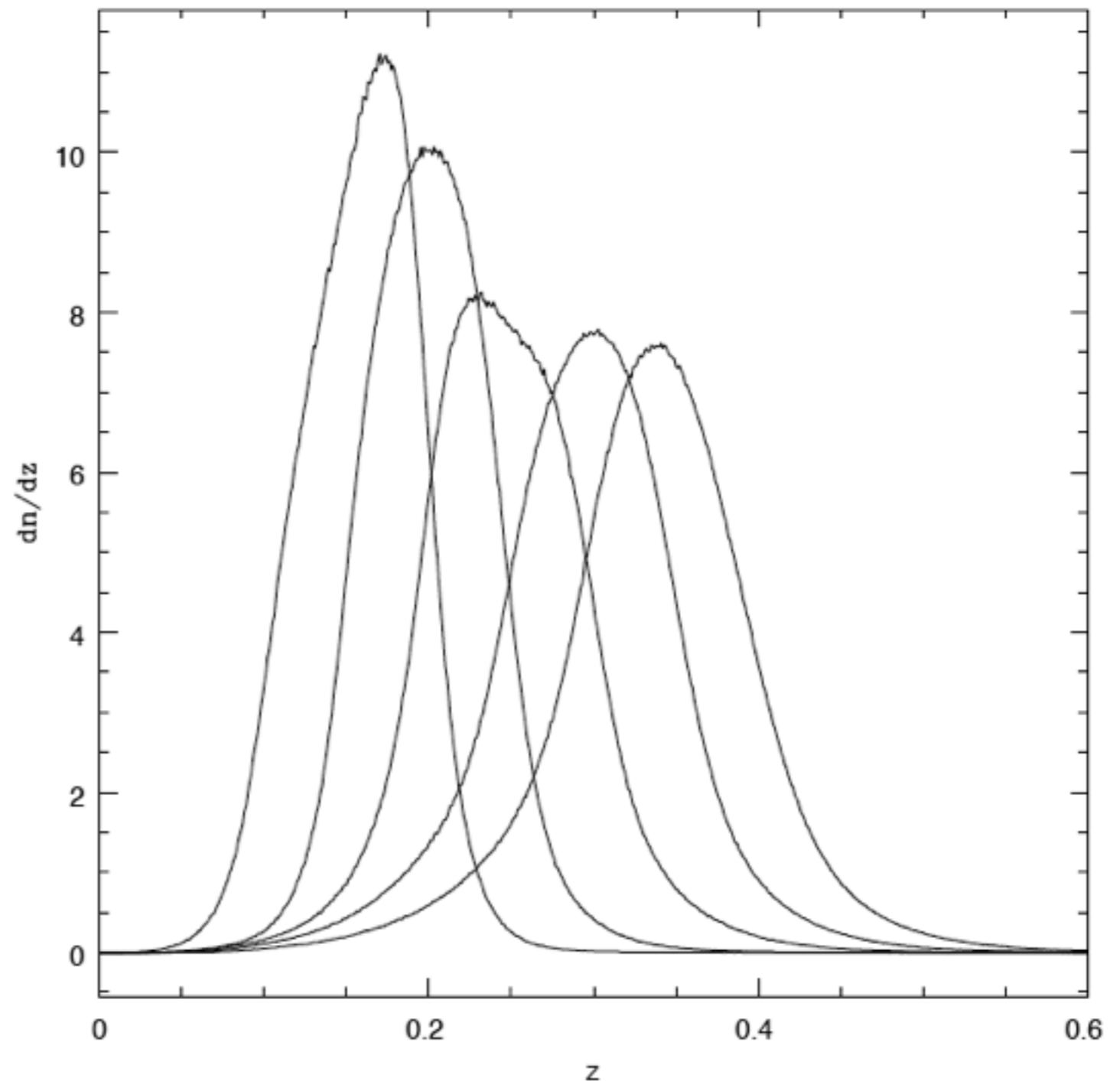


# Comparison with Spectroscopic



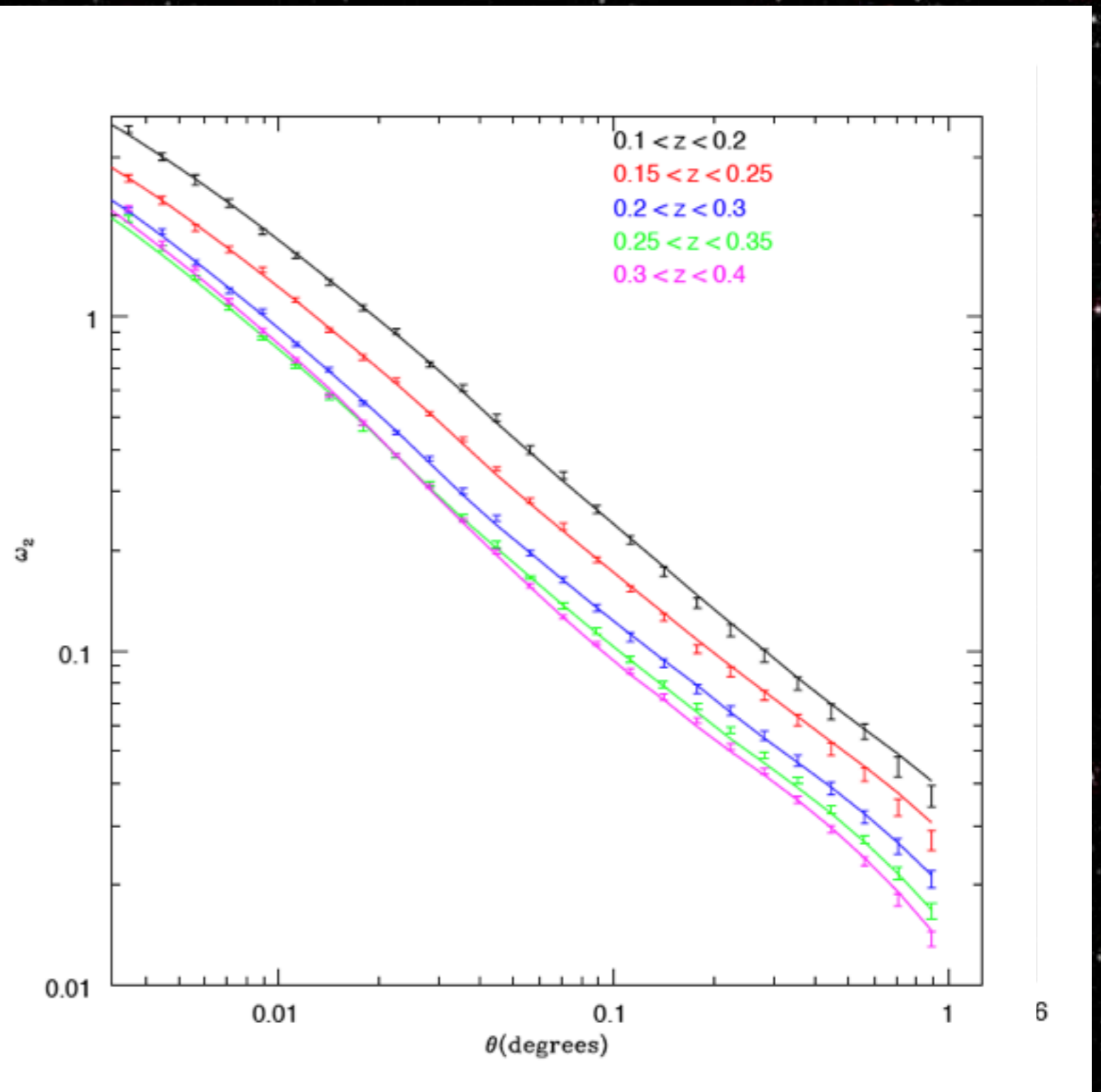
# Redshift Evolution

- Use DR7 galaxies with  $0.1 < z < 0.4$ ,  $M_r - 5\log h < -20.4$
- Split into 5 (overlapping) photoz shells
- $b_I$  increases from 1.2 to 1.35



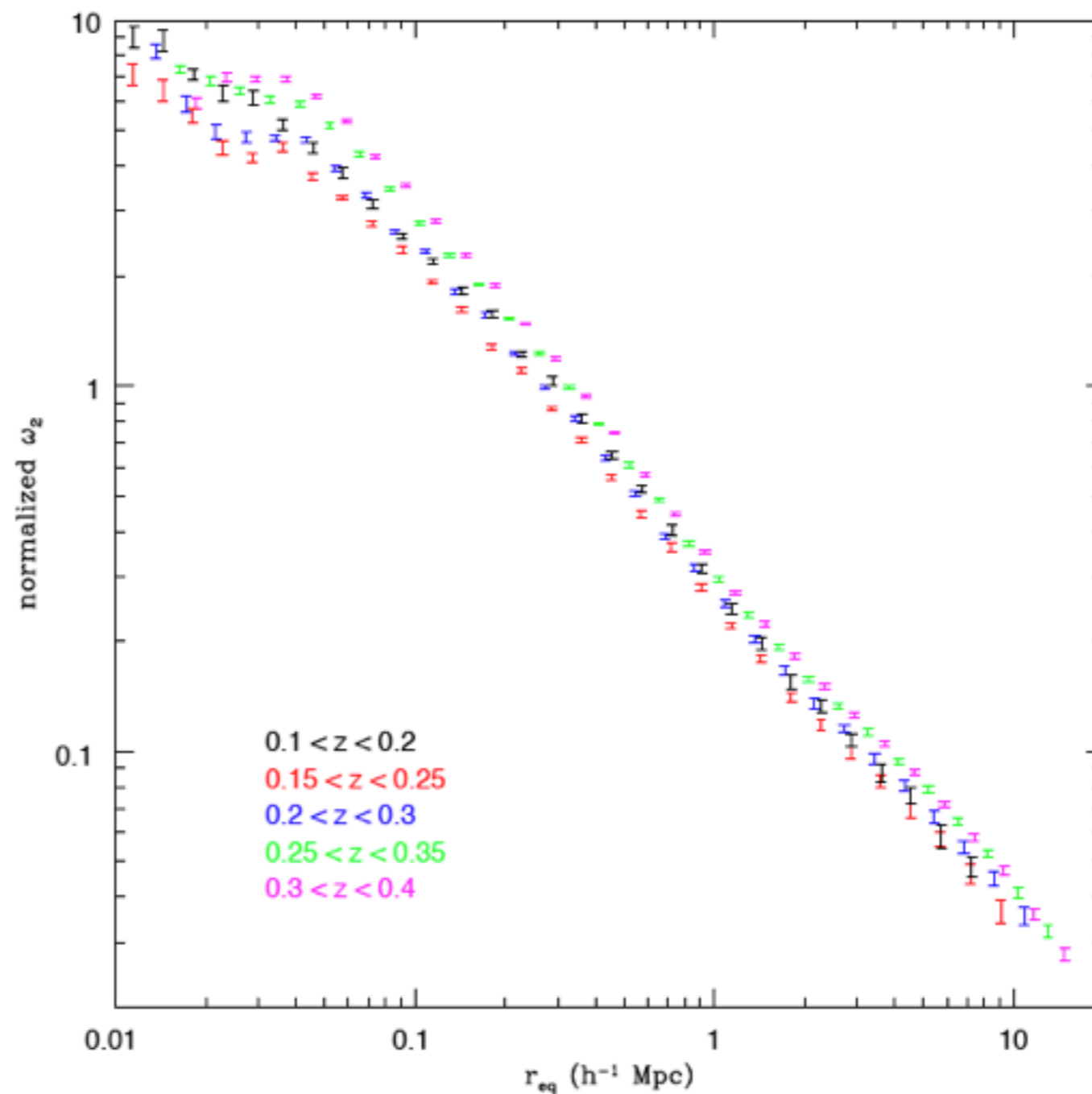
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- $b_l$  increases from 1.2 to 1.35

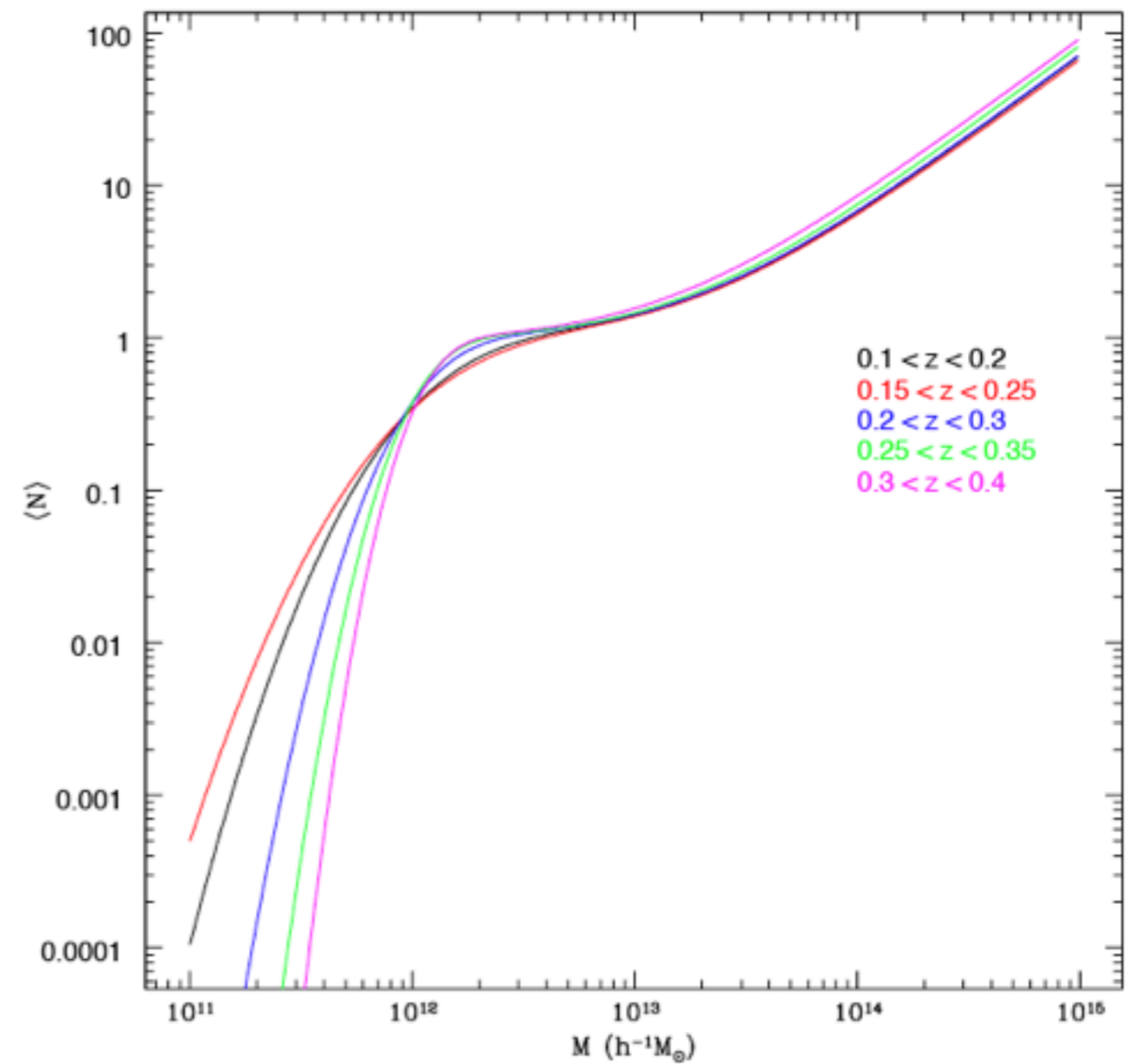
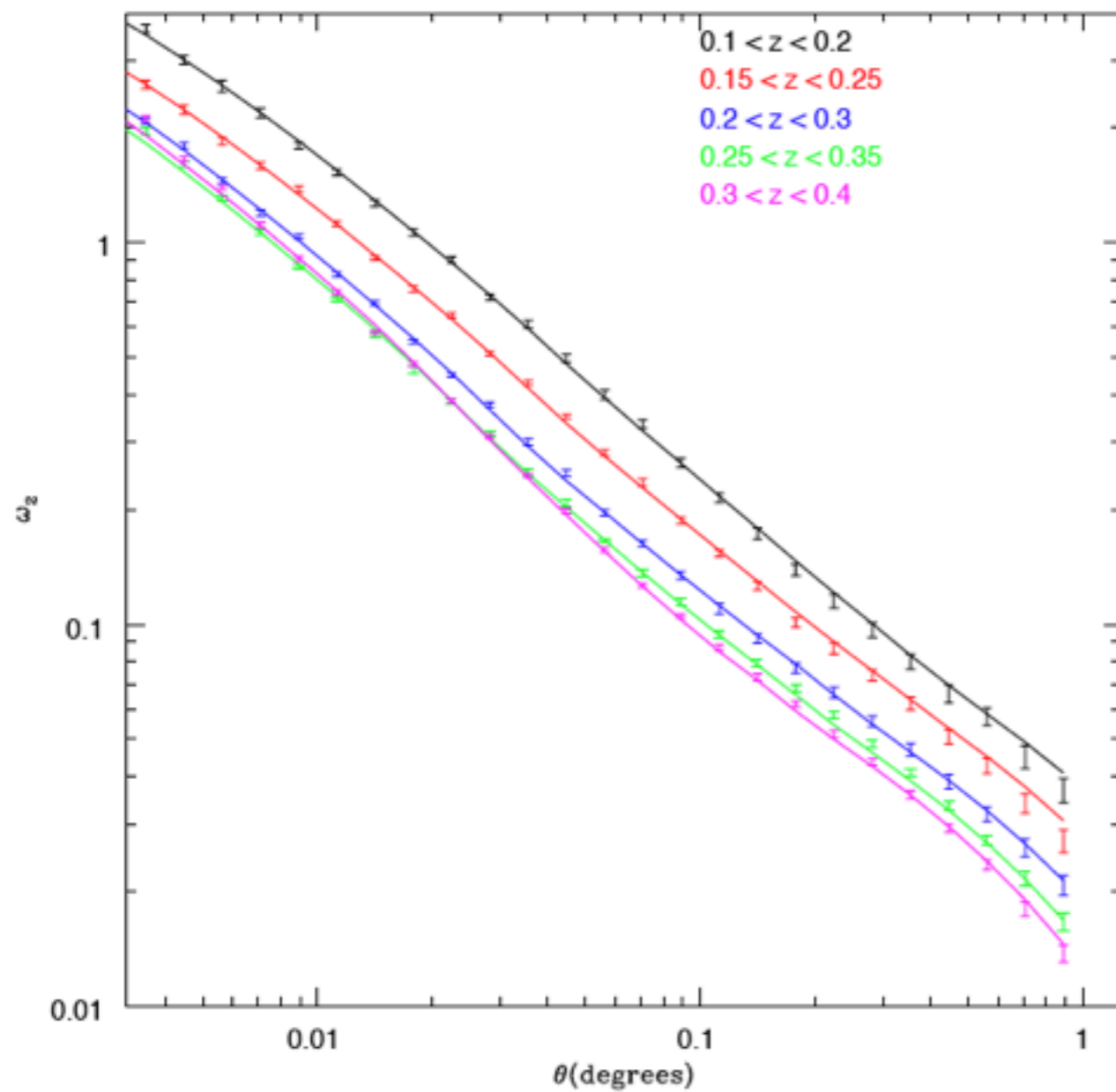


# Redshift Evolution

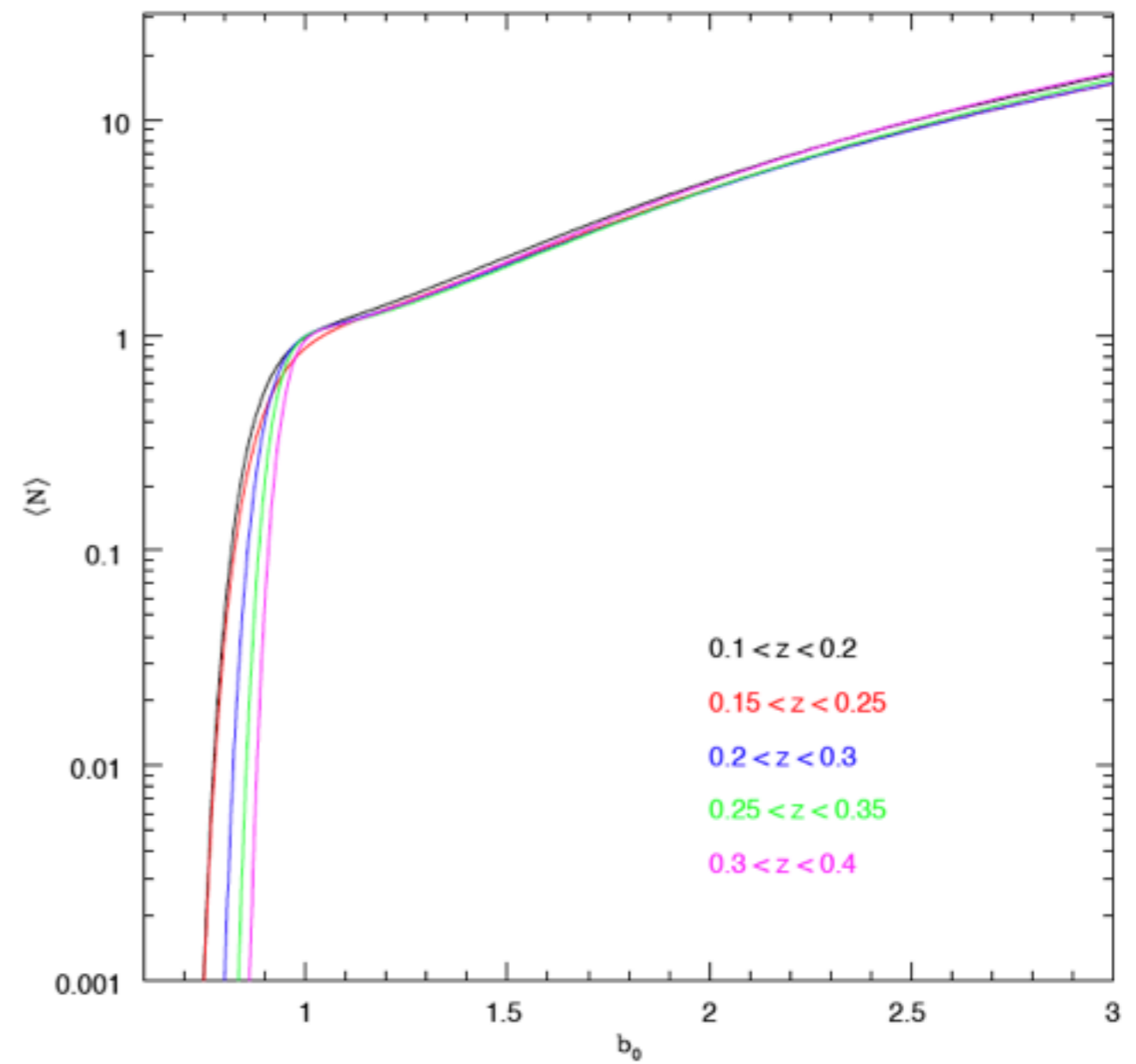
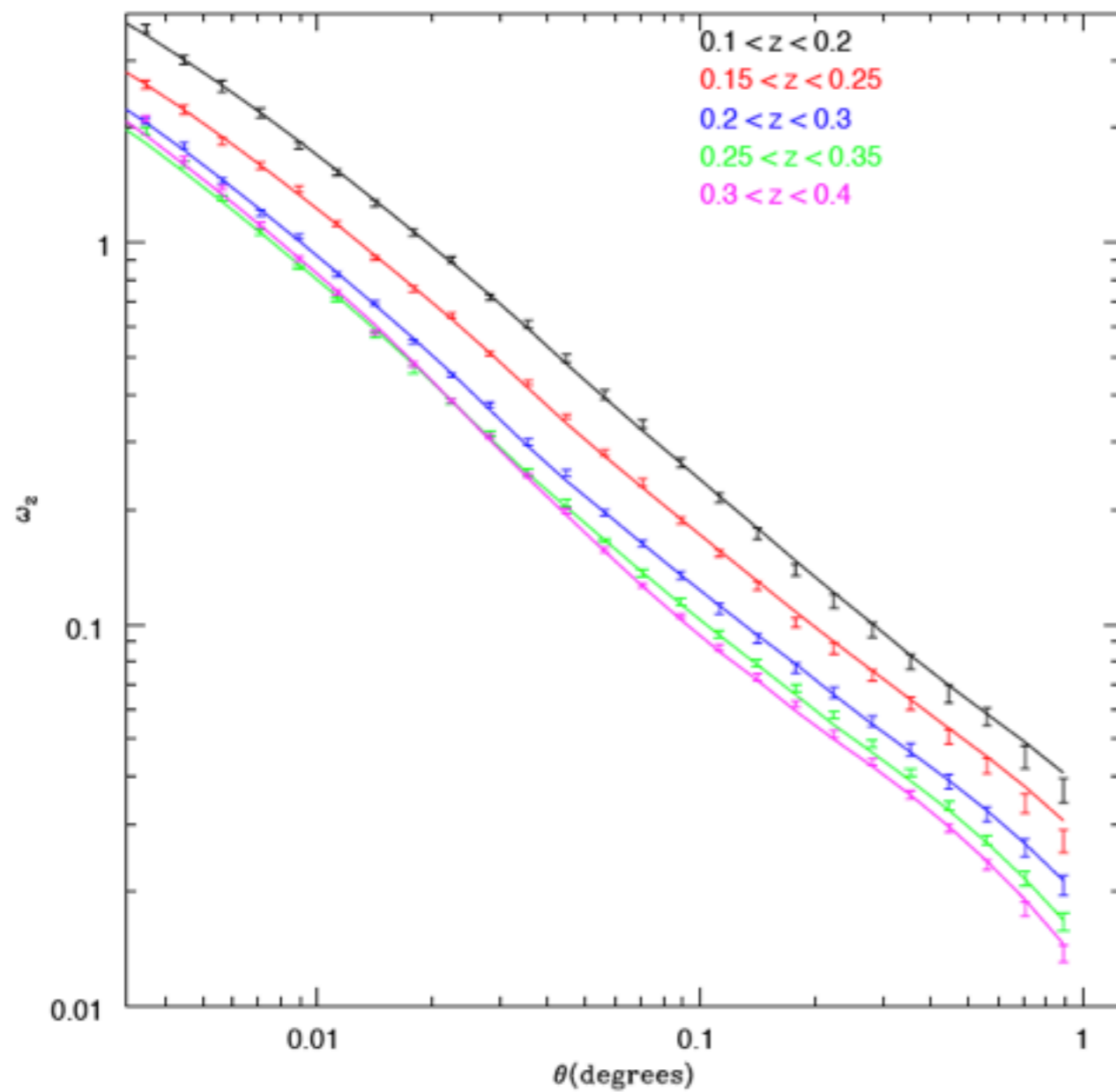
- Use DR7 galaxies with  $0.1 < z < 0.4$ ,  $M_r - 5\log h < -20.4$
- Split into 5 (overlapping) photoz shells
- $b_I$  increases from 1.2 to 1.35



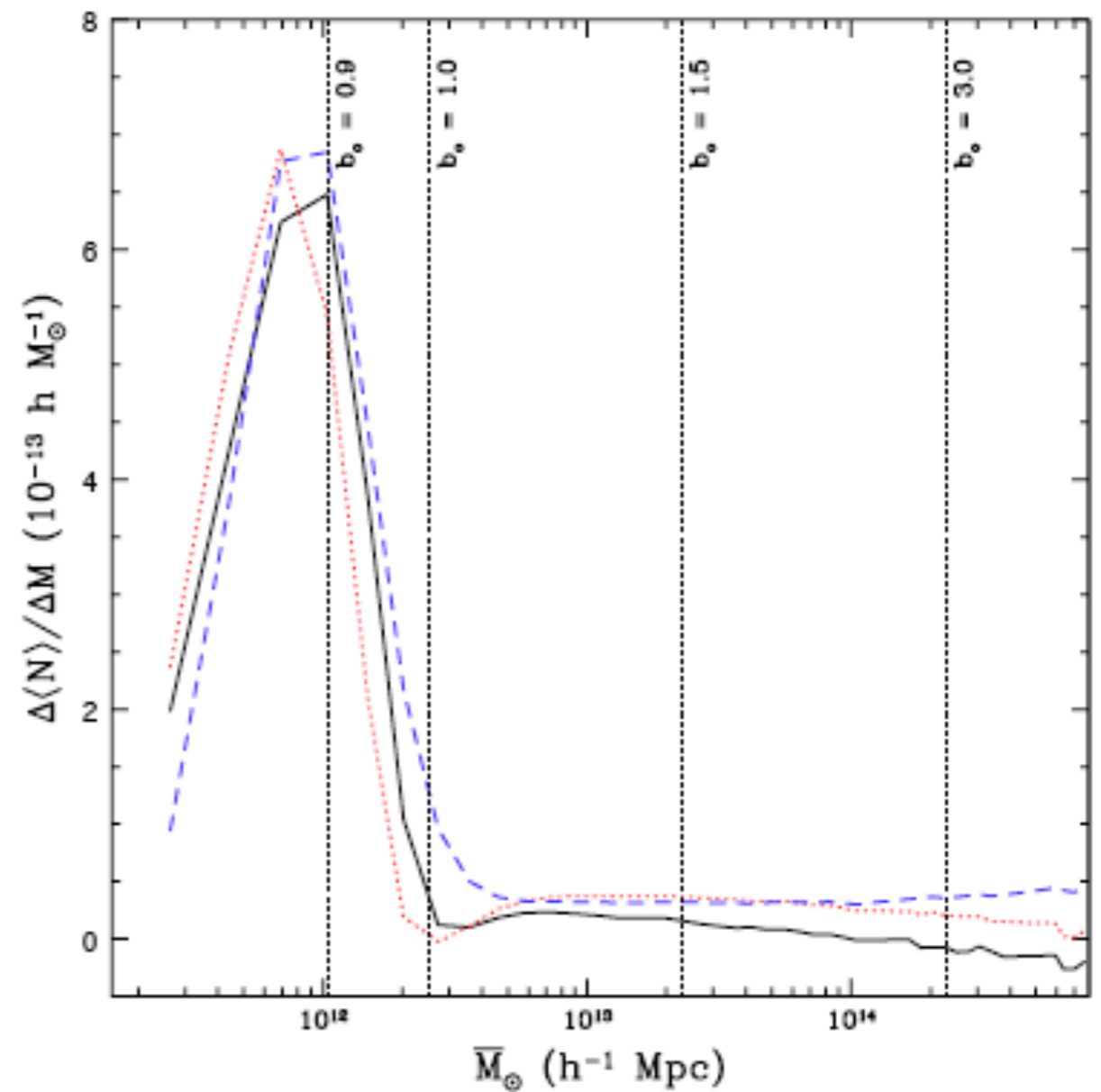
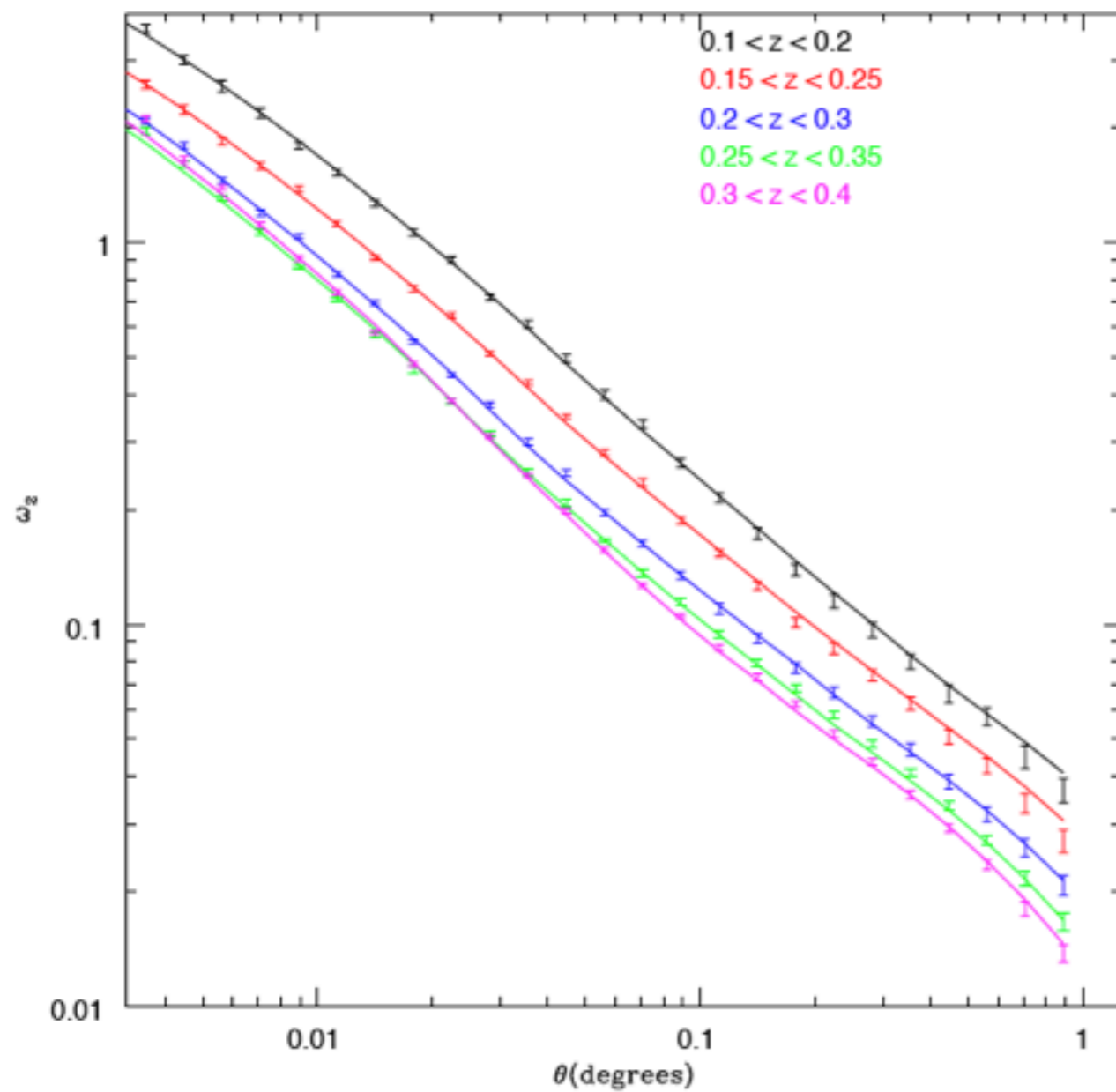
# HOD Model Fits



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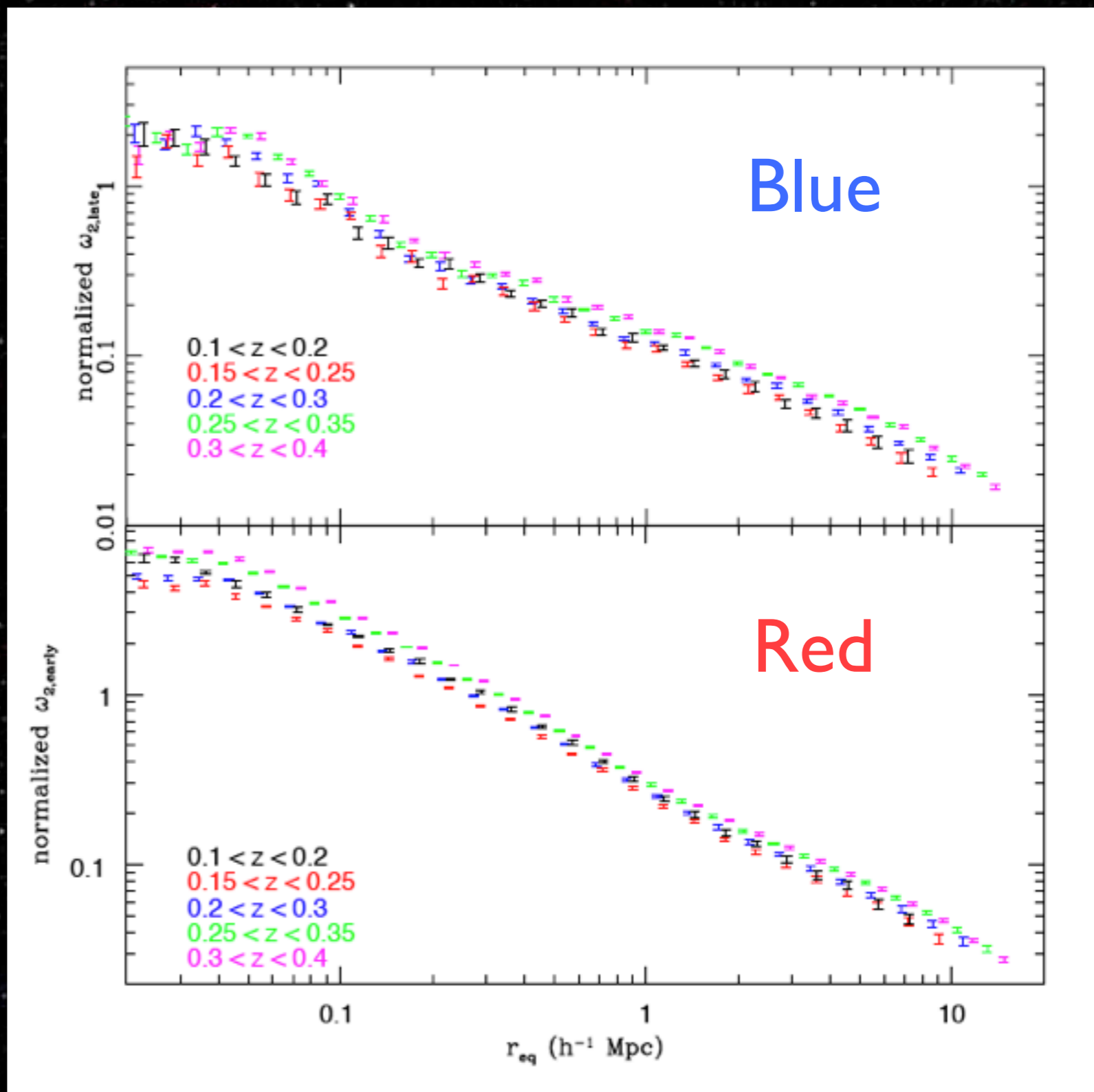


# HOD Model Fits



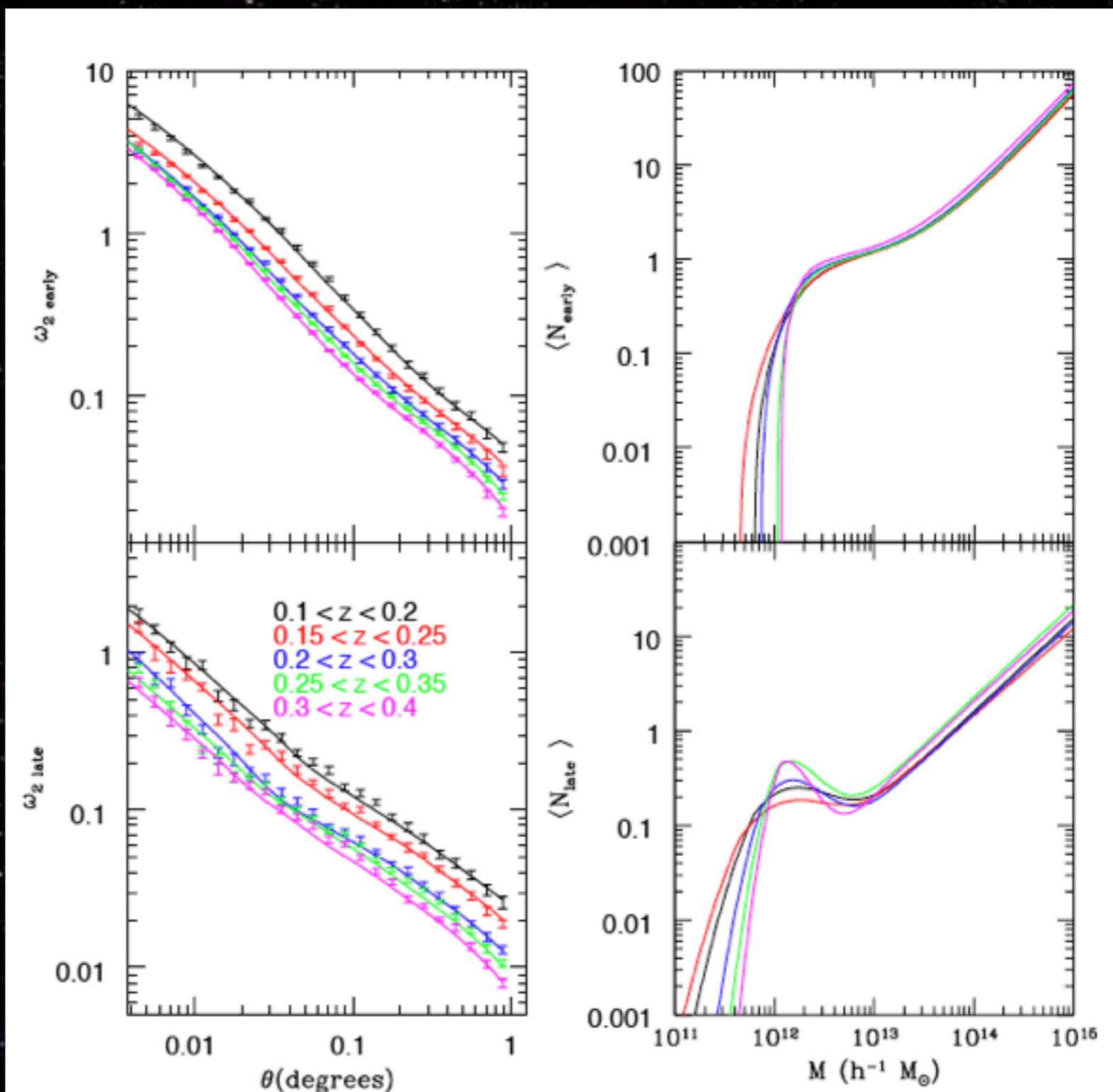
# Red/Blue

- Increase in bias similar for red and blue
- HOD fits continue to favour minimal mixing



# Red/Blue

- Increase in bias similar for red and blue
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# SDSS HOD modeling

- Early/late-type galaxies prefer to exist in separate DM halos
- $\sim L^*$  Galaxies forming in  $10^{12} M_{\text{solar}}$  halos
- Clustering measurements complementary to spectroscopic (larger range of scales, redshift range)
- DES will allow similar studies between  $z = 0$  and  $z = 1$

# Conclusions

- Much can be learned from SDSS photometric data
  - More robust measure of red galaxy bias/luminosity relationship
  - HOD model for red /blue improved
  - Evolution bias -> galaxy interaction in low mass halos
- Future surveys will rely on photometric data
  - Develop methods for determining best photoz samples, measurement techniques
  - Best results will come from combining  $\omega_2$ , WL, and higher order measurements (will require focused collaboration!)