

# The Galaxy-Halo Connection

FRANK VAN DEN BOSCH  
YALE UNIVERSITY



# OUTLINE

## LECTURE 1

- A primer on Structure Formation
- The Halo Model
- Halo Occupation Modeling
  - Halo Occupation Distribution (HOD)
  - Conditional Luminosity Function (CLF)
  - Subhalo Abundance Matching (SHAM)

## LECTURE 2

- Empirical Constraints
  - Galaxy clustering
  - Galaxy-Galaxy lensing
  - Satellite kinematics
- Galaxy-Halo Connection
  - Stellar Mass-Halo Mass Relation (SHMR)
  - Scatter in SHMR
  - Satellite Galaxies
- Cosmological Constraints
  - The  $S_8$  tension
  - Artificial Subhalo Disruption & Orphans
  - Baryonic Effects
  - Assembly Bias
- Issues & Concerns



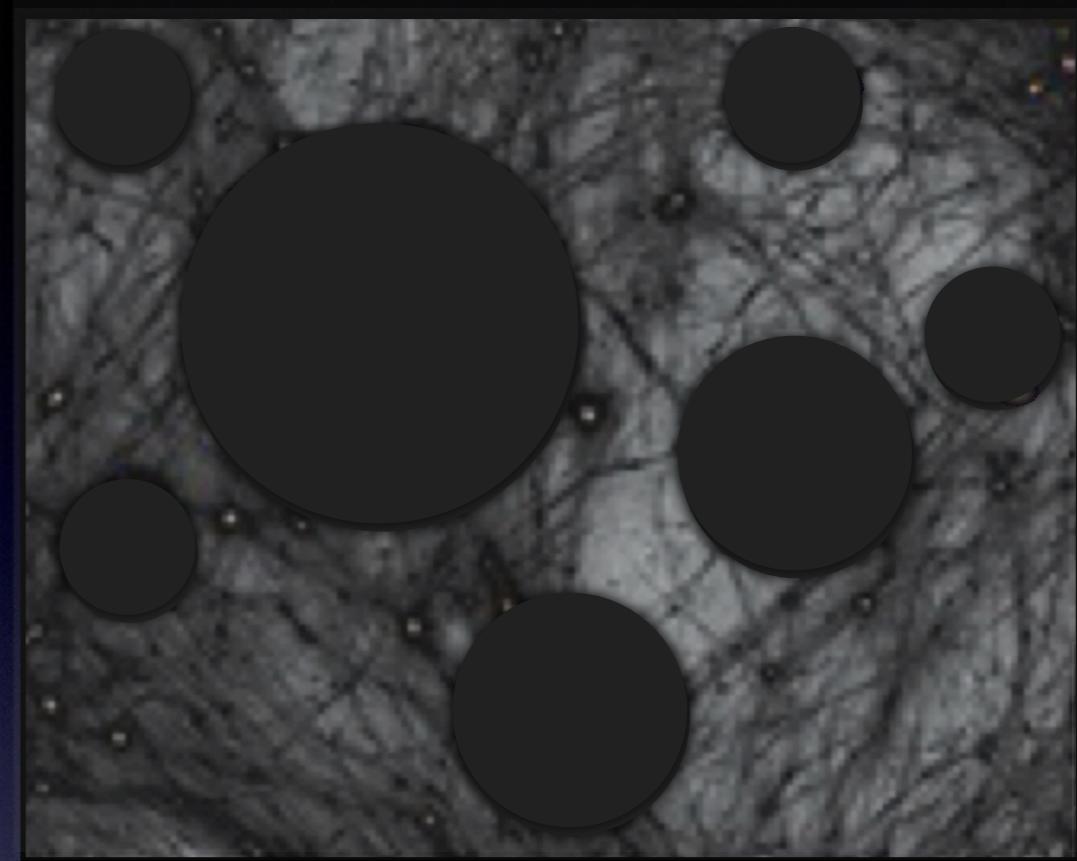
# **Constraints from clustering**

# From Clustering to Galaxy-Halo Connection

## Analytical Halo Model

$$\begin{aligned}\xi(r) &= \xi^{1h}(r) + \xi^{2h}(r) \\ \xi^{1h}(r) &= \frac{1}{\bar{\rho}^2} \int dM M^2 n(M) \int d^3\vec{y} u(\vec{x} - \vec{y}|M) u(\vec{x} + \vec{r} - \vec{y}|M) \\ \xi^{2h}(r) &= \frac{1}{\bar{\rho}^2} \int dM_1 M_1 b(M_1) n(M_1) \int dM_2 M_2 b(M_2) n(M_2) \times \\ &\quad \int d^3\vec{y}_1 \int d^3\vec{y}_2 u(\vec{x} - \vec{y}_1|M_1) u(\vec{x} + \vec{r} - \vec{y}_2|M_2) \xi_{mm}^{\text{lin}}(\vec{y}_1 - \vec{y}_2)\end{aligned}$$

For given  $\Phi(L | M)$  and  $n_{\text{sat}}(r | M)$ ,  
compute the two-point correlation  
function and compare to observations

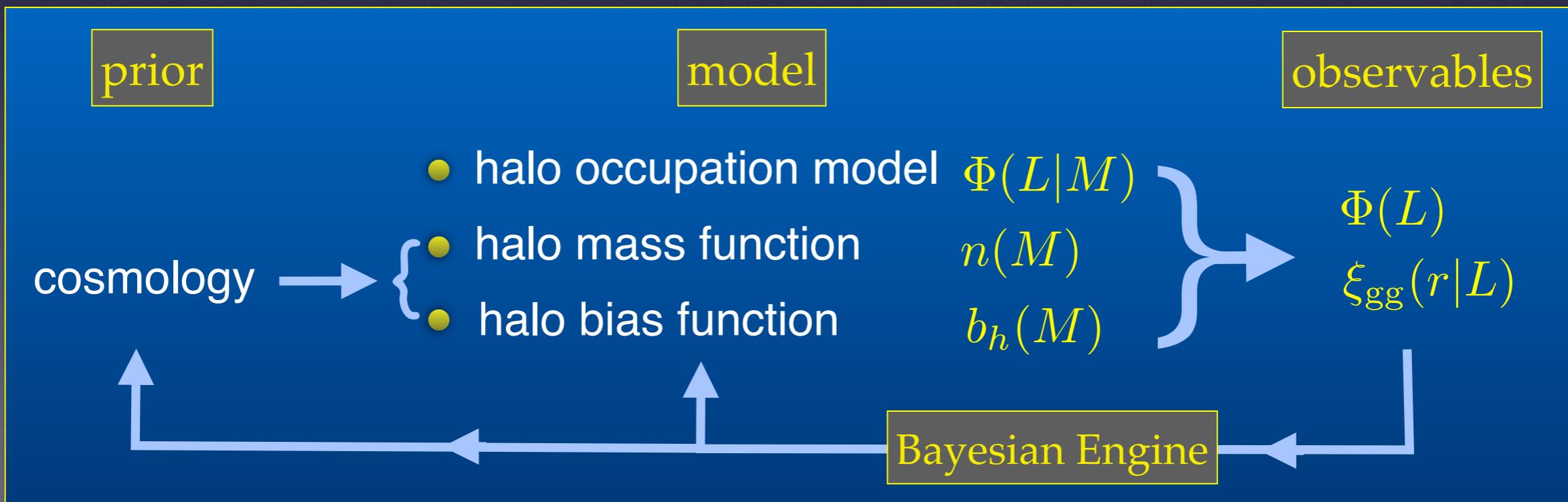
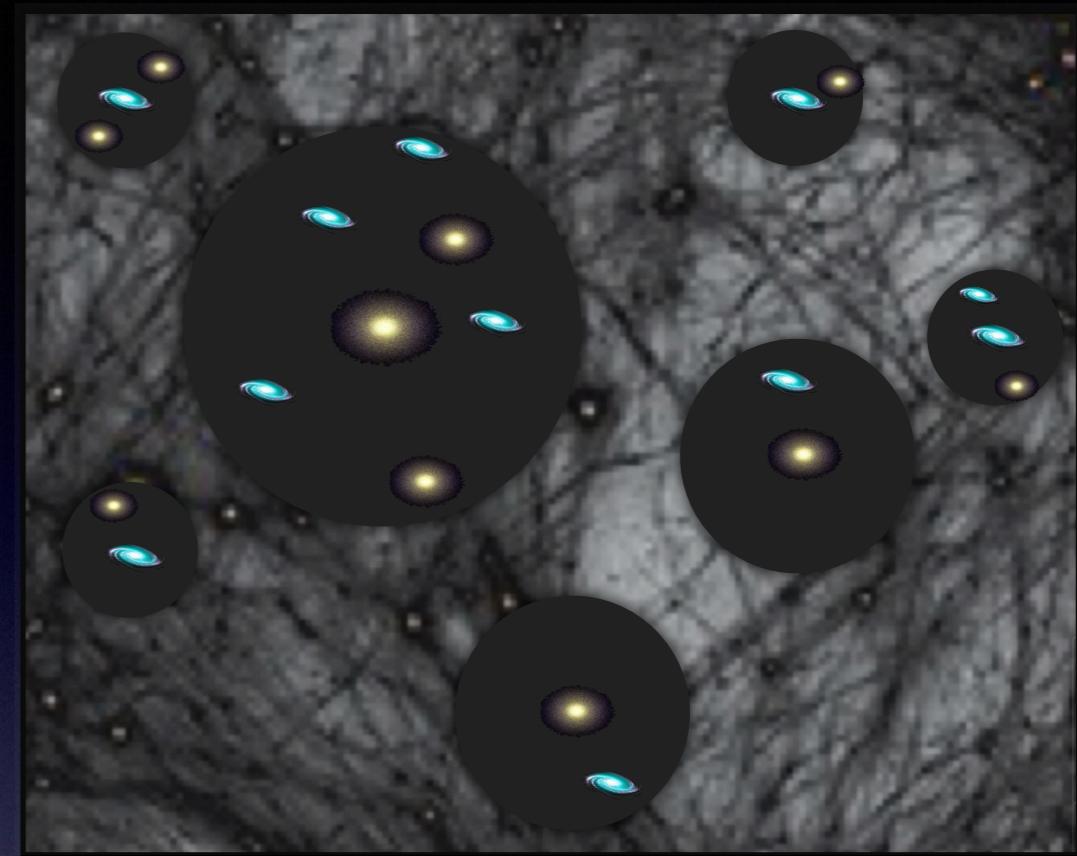


# From Clustering to Galaxy-Halo Connection

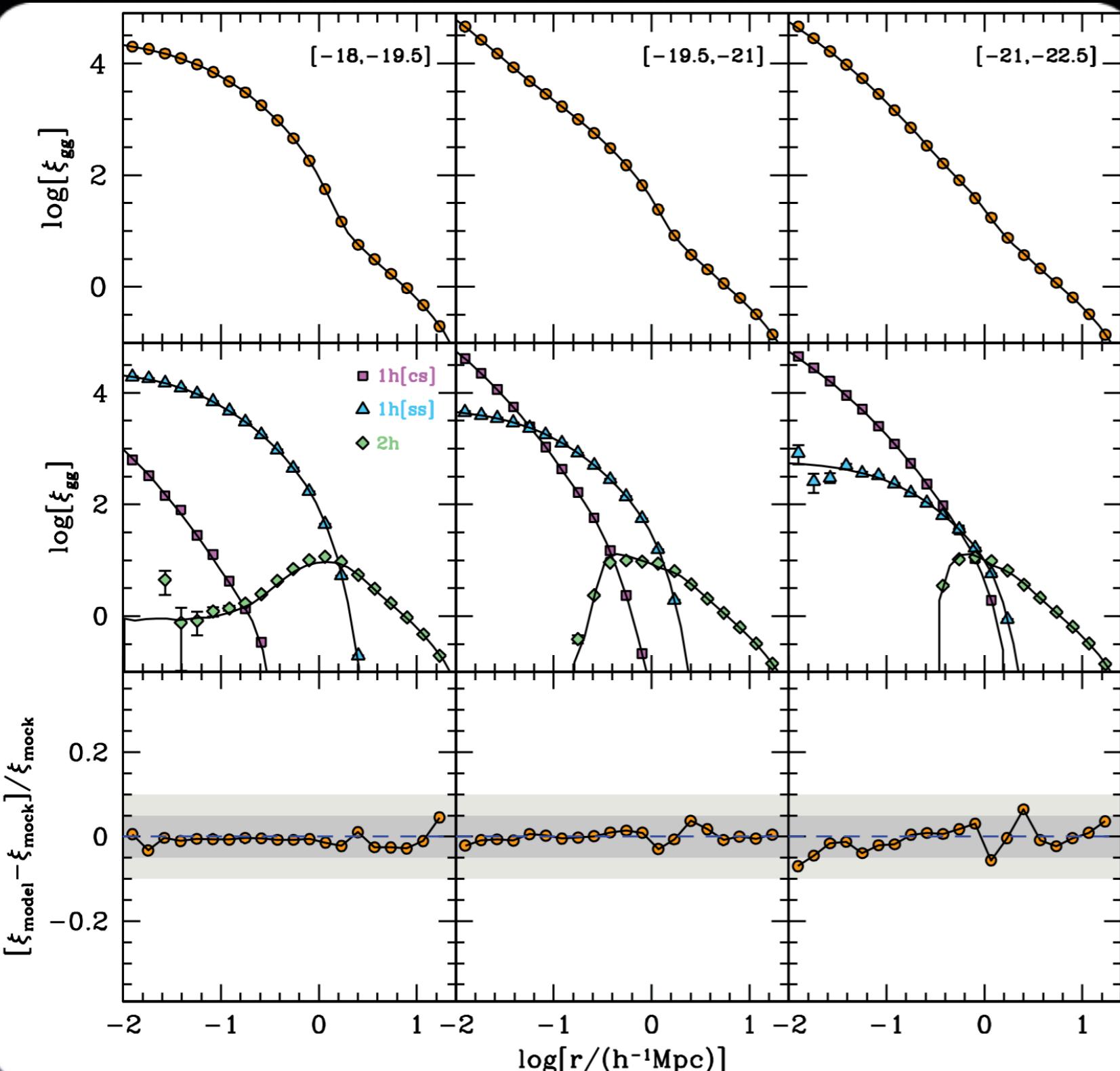
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# Testing with Mock Data



Populate dark matter halos  
in **N-body simulation** with  
mock galaxies using **CLF**

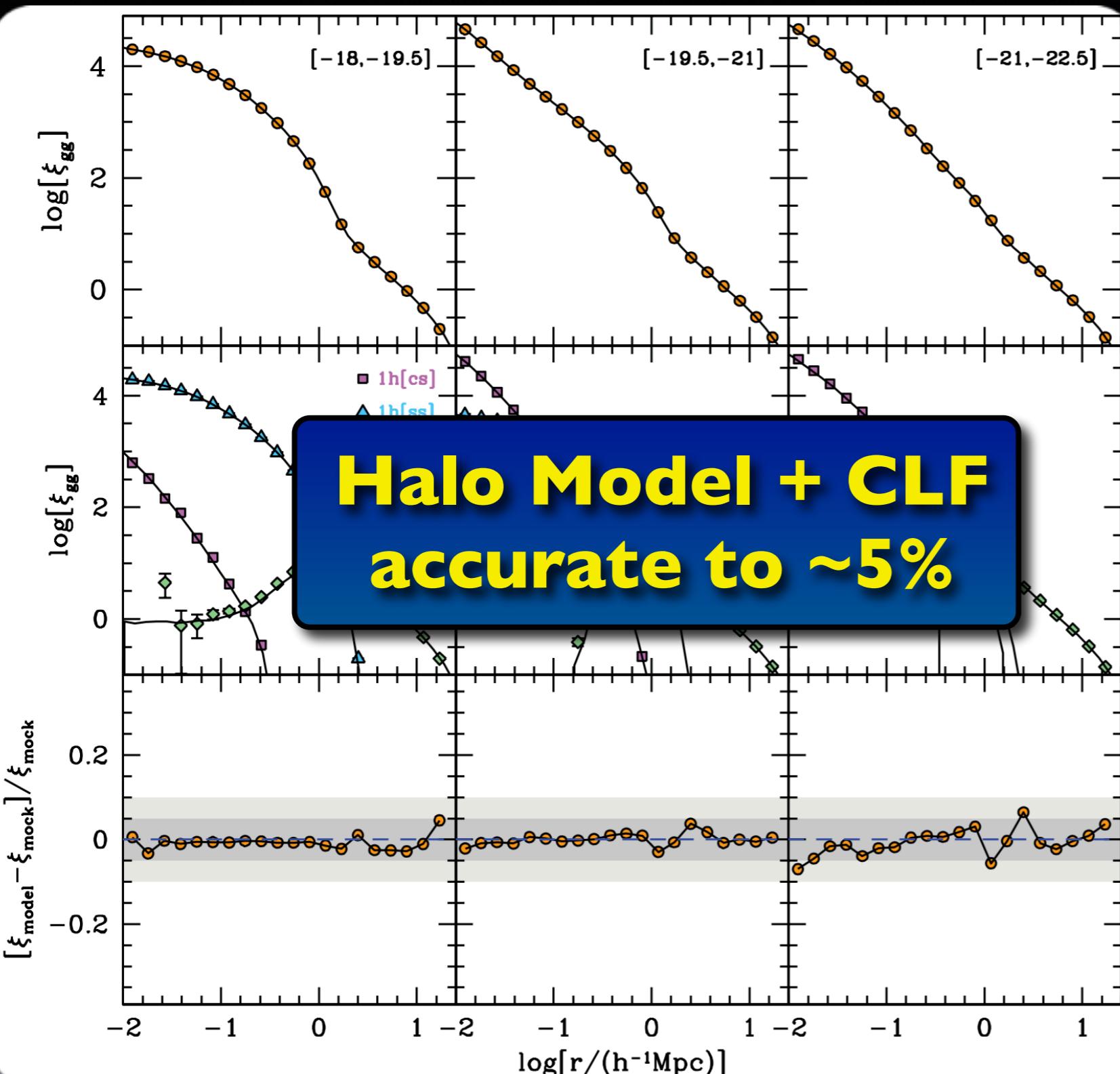
Construct mock SDSS

Measure clustering in  
mock **SDSS** data

Predict clustering using  
analytical model with  
same **CLF** and compare

source: vdBosch et al. 2013

# Testing with Mock Data



Populate dark matter halos in **N-body simulation** with mock galaxies using **CLF**

Construct mock SDSS

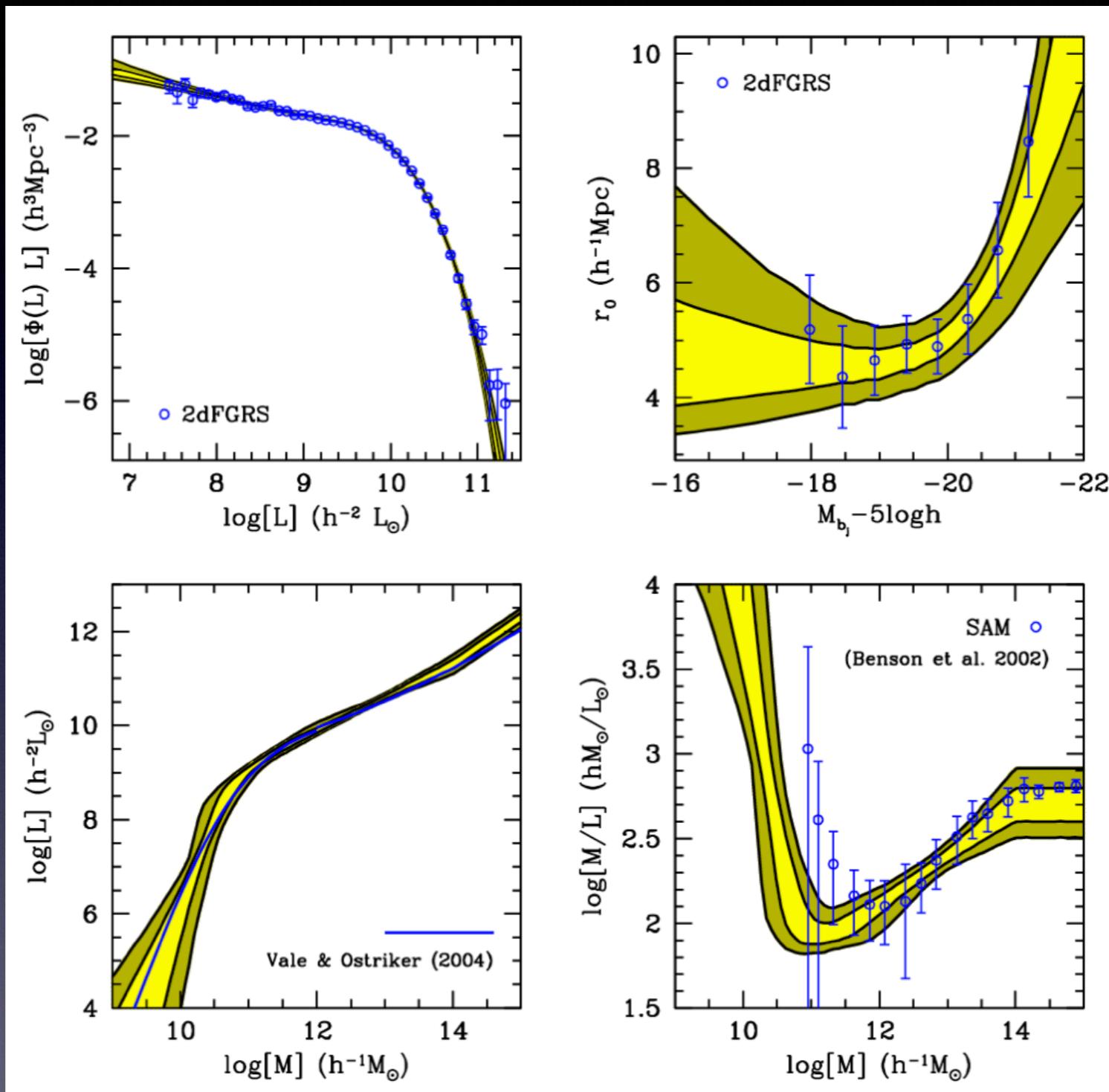
Measure clustering in mock **SDSS** data

Predict clustering using analytical model with same **CLF** and compare

source: vdBosch et al. 2013

# Constraints on Halo Occupation Statistics

2004

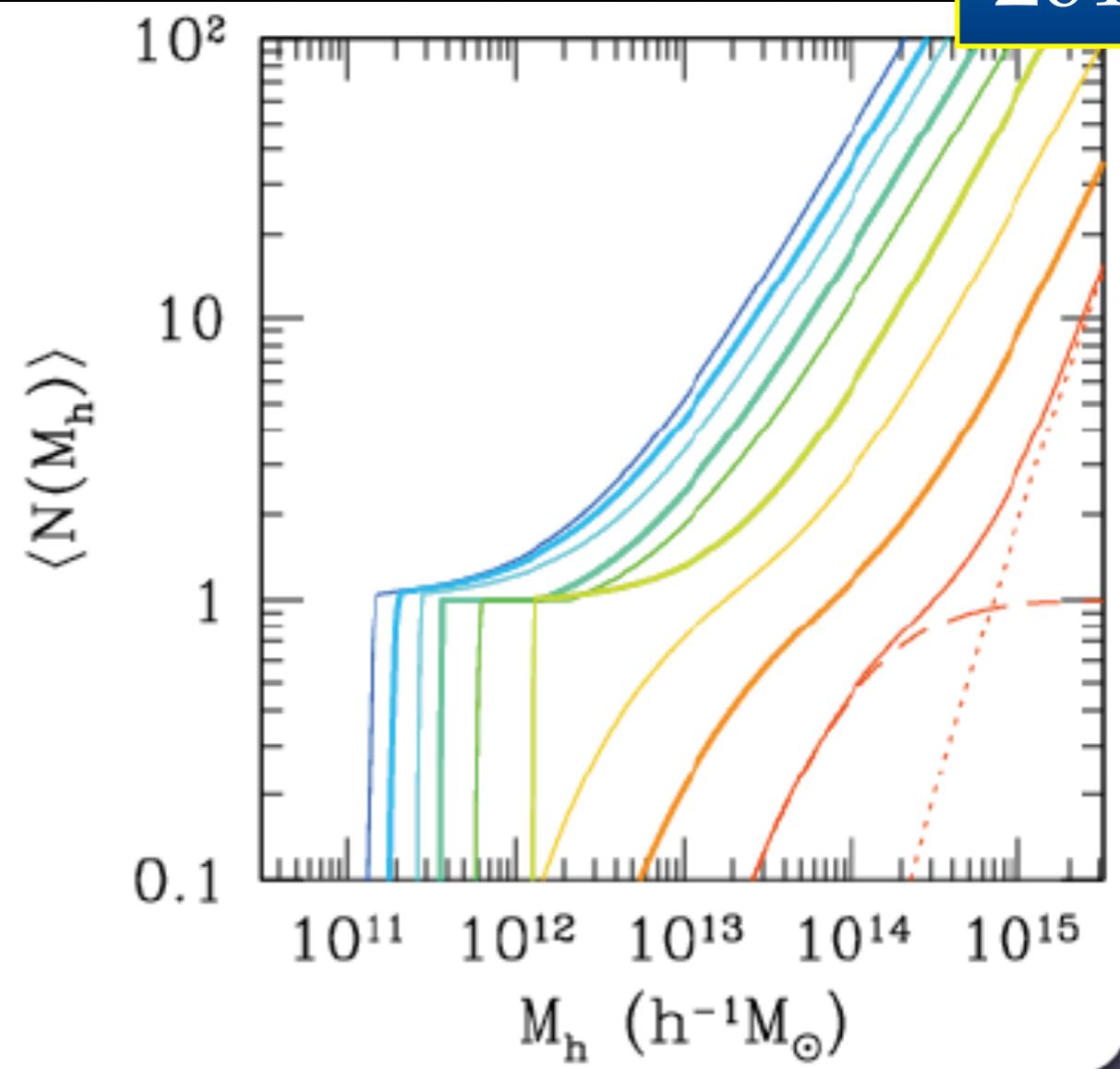
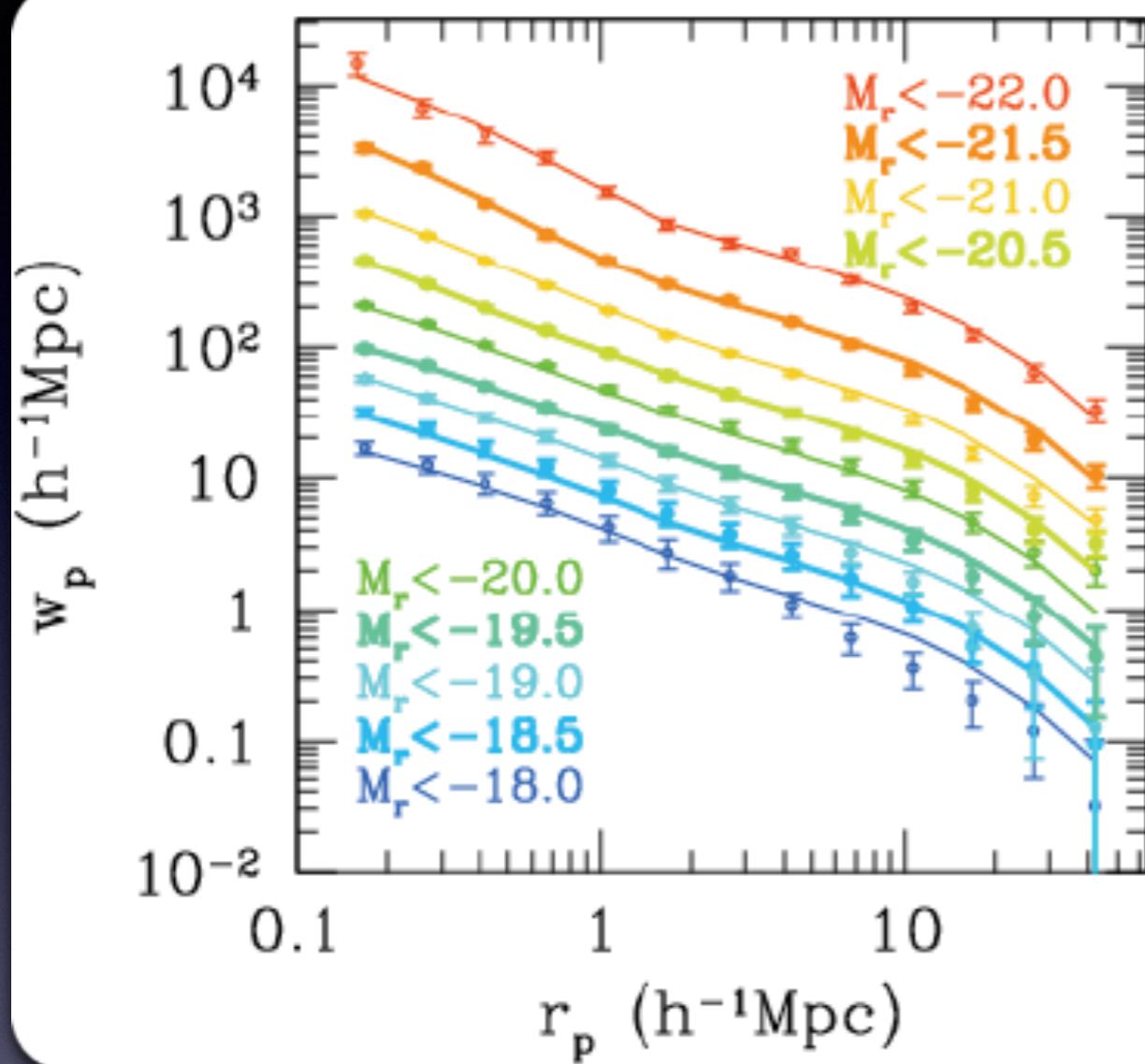


vdBosch, Yang & Mo 2004

One of the first, clustering-based constraints, on galaxy-halo connection

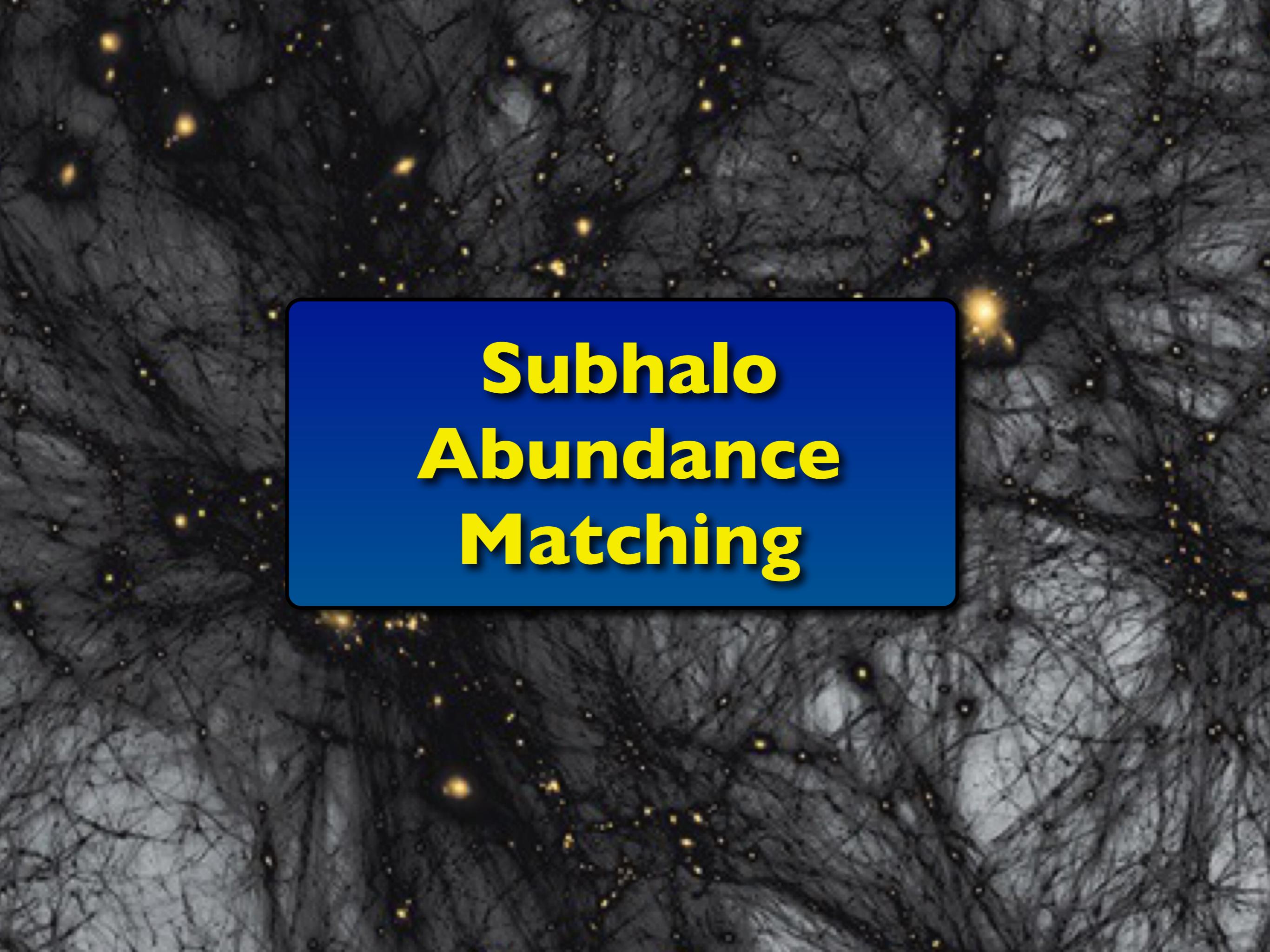
# Constraints on Halo Occupation Statistics

2011



Source: Zehavi et al. 2011

Simple HOD models can accurately fit the (projected) correlation functions for 9 different SDSS luminosity threshold samples...

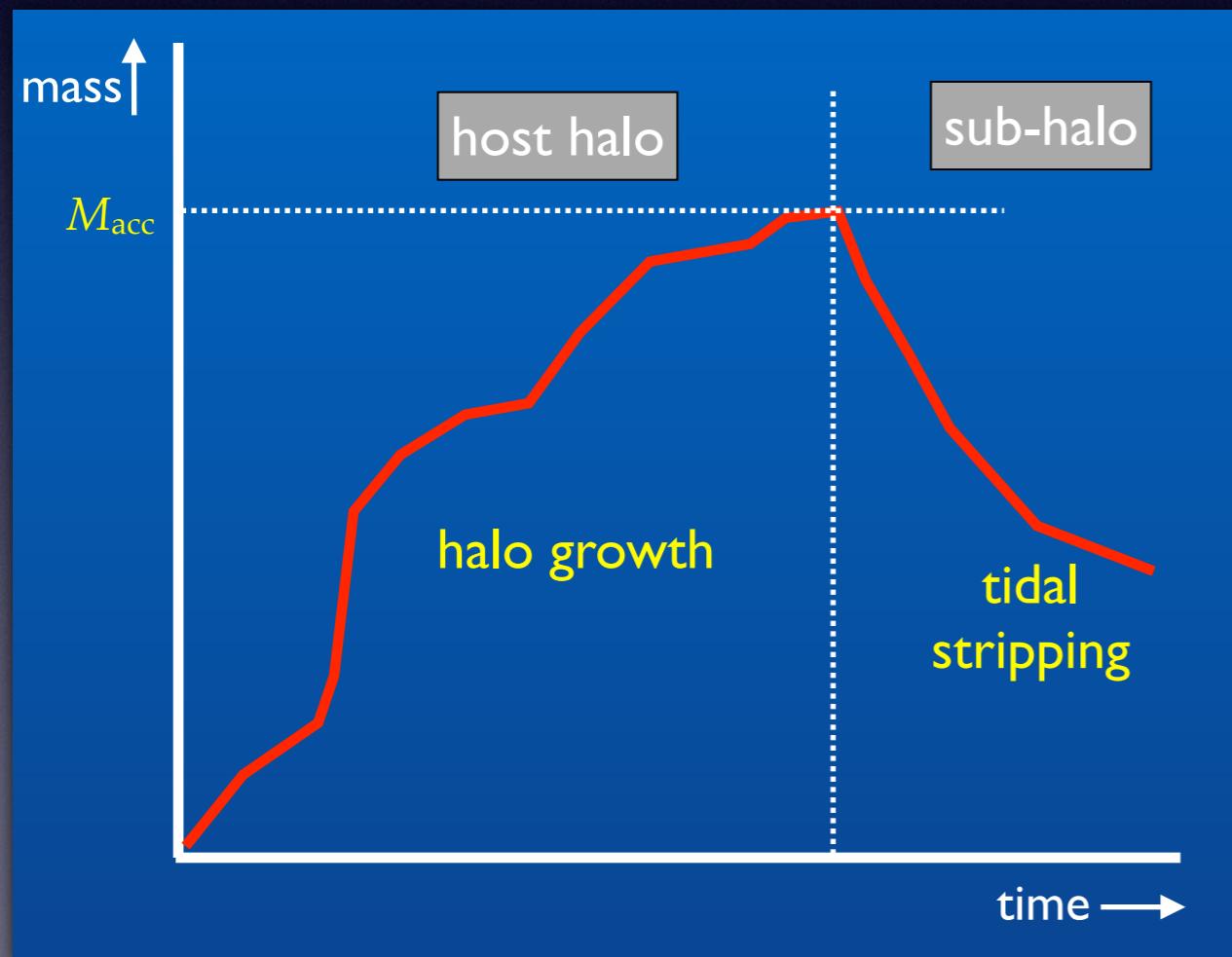


# **Subhalo Abundance Matching**

# Subhalo Abundance Matching

## Key Premises

- Galaxies form and reside in halos (including subhalos)
- There exist some halo property(ies) that are tightly correlated with the properties of the galaxies they host  
i.e.,  $L$  is strongly correlated with  $M$



## Ansatz

For satellite galaxies, their present-day luminosity/stellar mass is strongly correlated with their halo mass at accretion,  $M_{\text{acc}}$

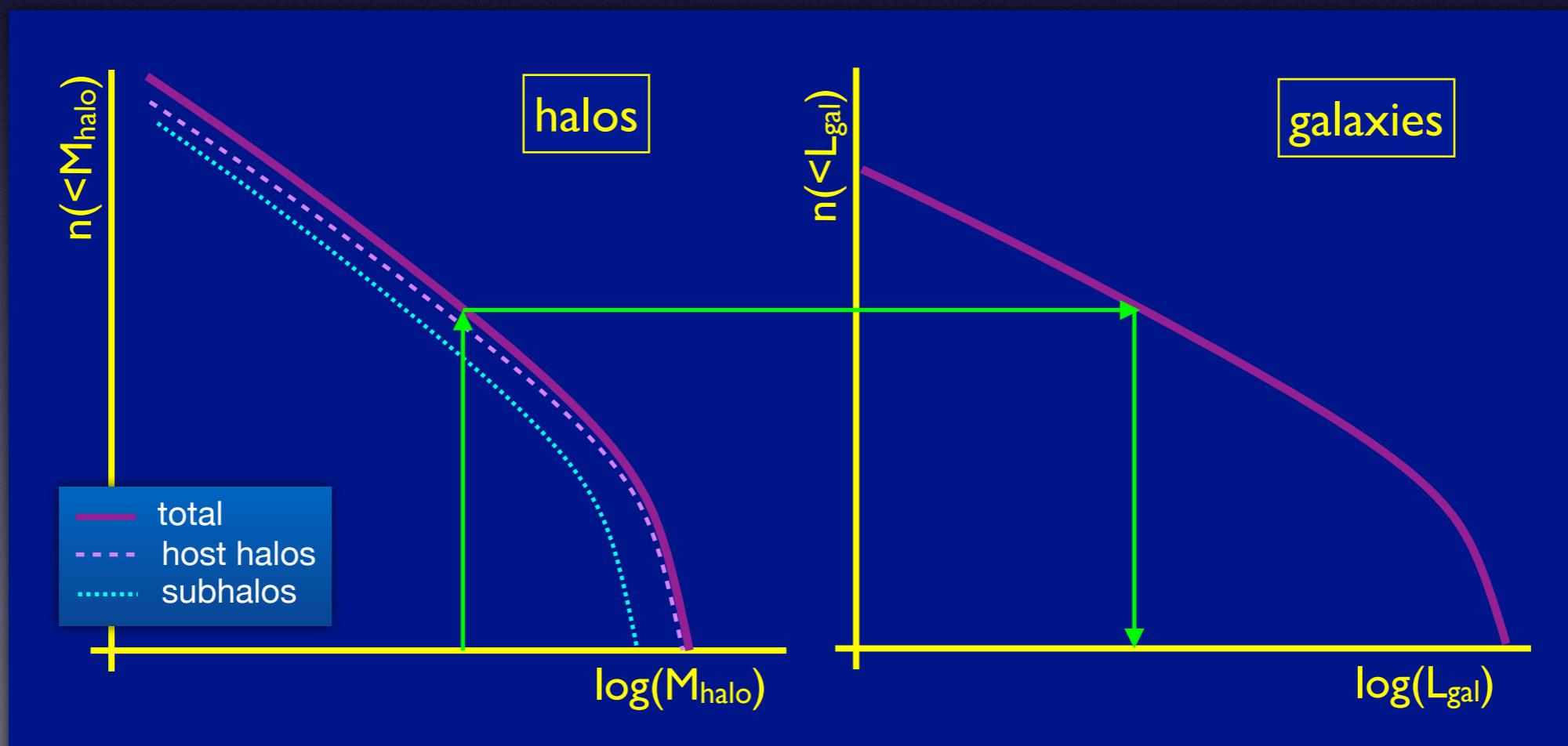
## Motivation

Satellite galaxies quench after infall and tides mainly strip dark matter

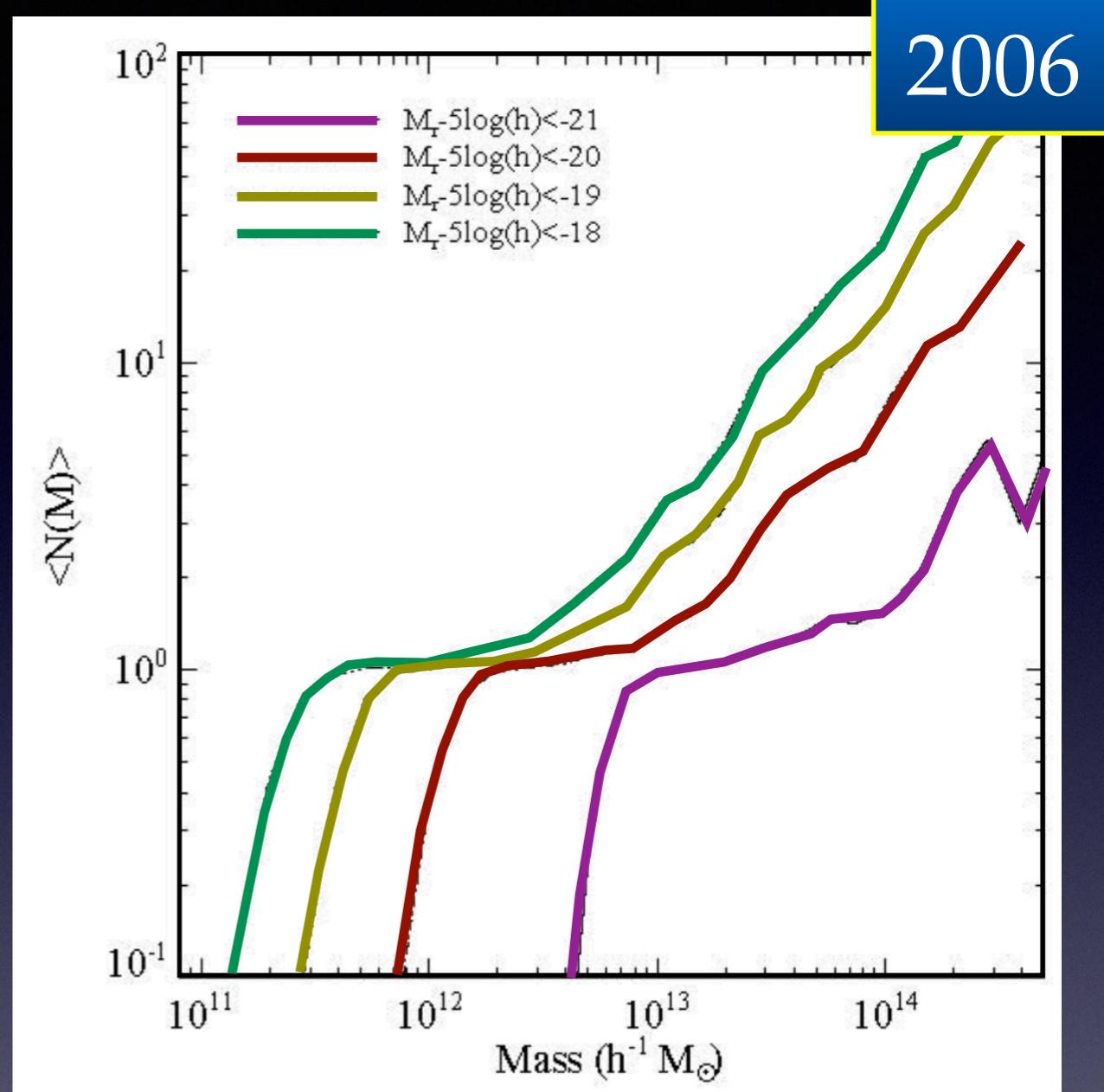
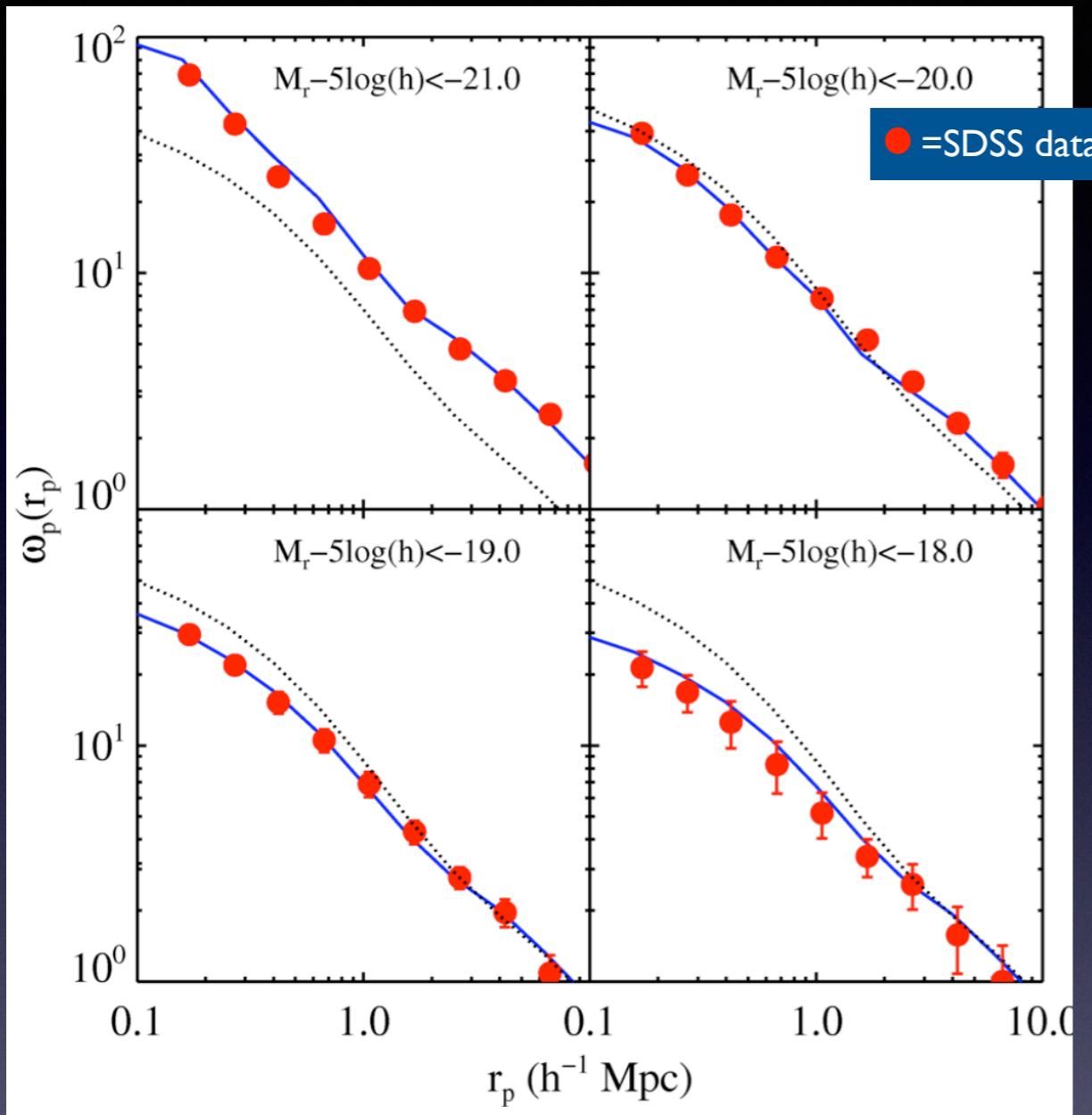
# Subhalo Abundance Matching

- From N-body simulation, obtain cumulative mass function of halos + subhalos (for latter, use mass at infall)
- From a galaxy redshift survey, obtain cumulative mass or luminosity function of galaxies
- Match rank orders....done

Kravtsov et al. 2004; Vale & Ostriker 2006, 2007; Conroy et al. 2006



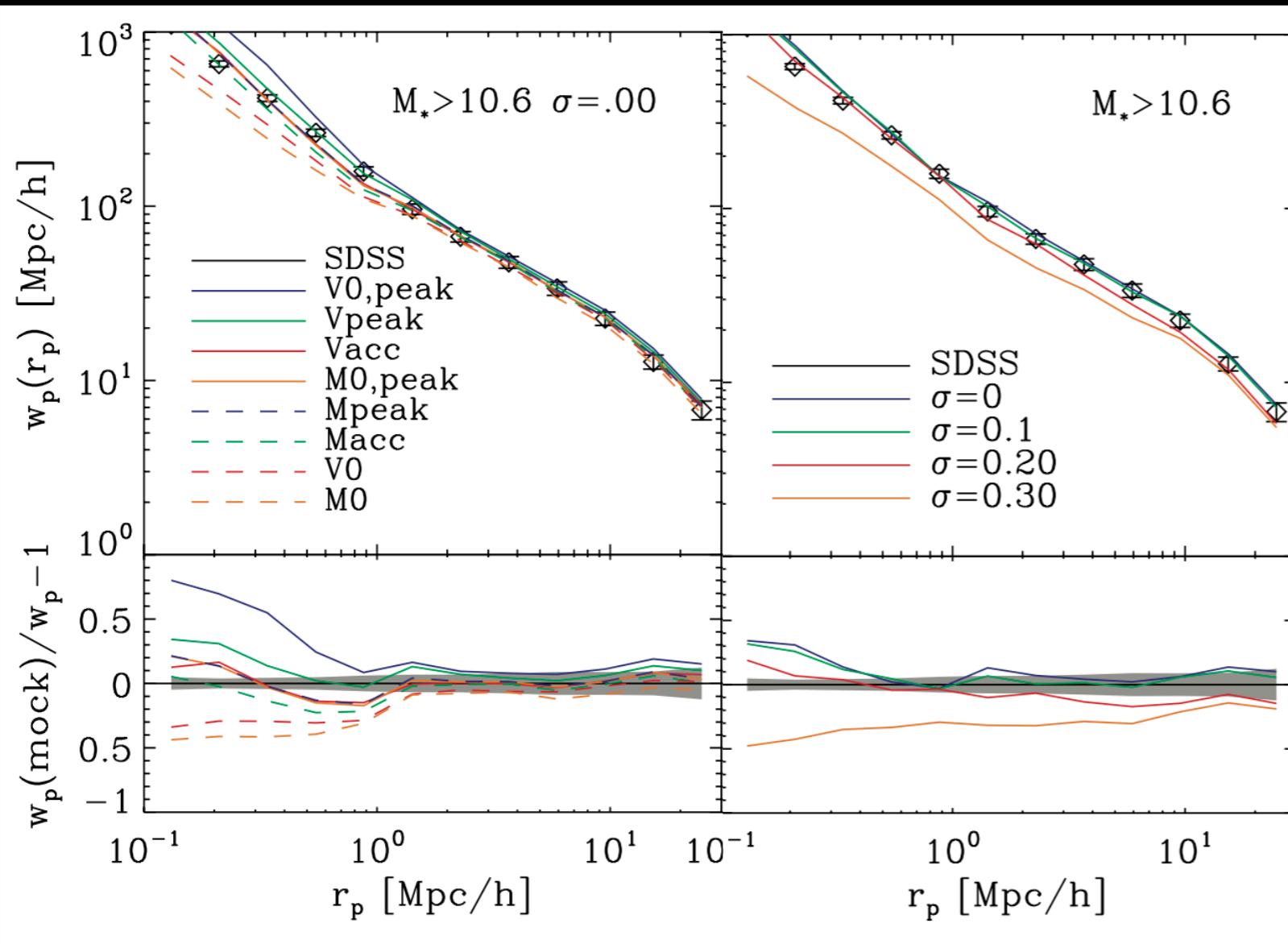
# Subhalo Abundance Matching



Source: Conroy, Wechsler & Kravtsov 2006

...suggests that satellites indeed stop forming stars at infall (quenching)...

# Subhalo Abundance Matching



Source: Reddick et al. 2013

## Downsides of SHAM

- Only works for complete samples of galaxies
- Requires N-body simulations
- artificial disruption;  
SHAM to be complemented with orphan treatment

Campbell, vdB et al. 2018

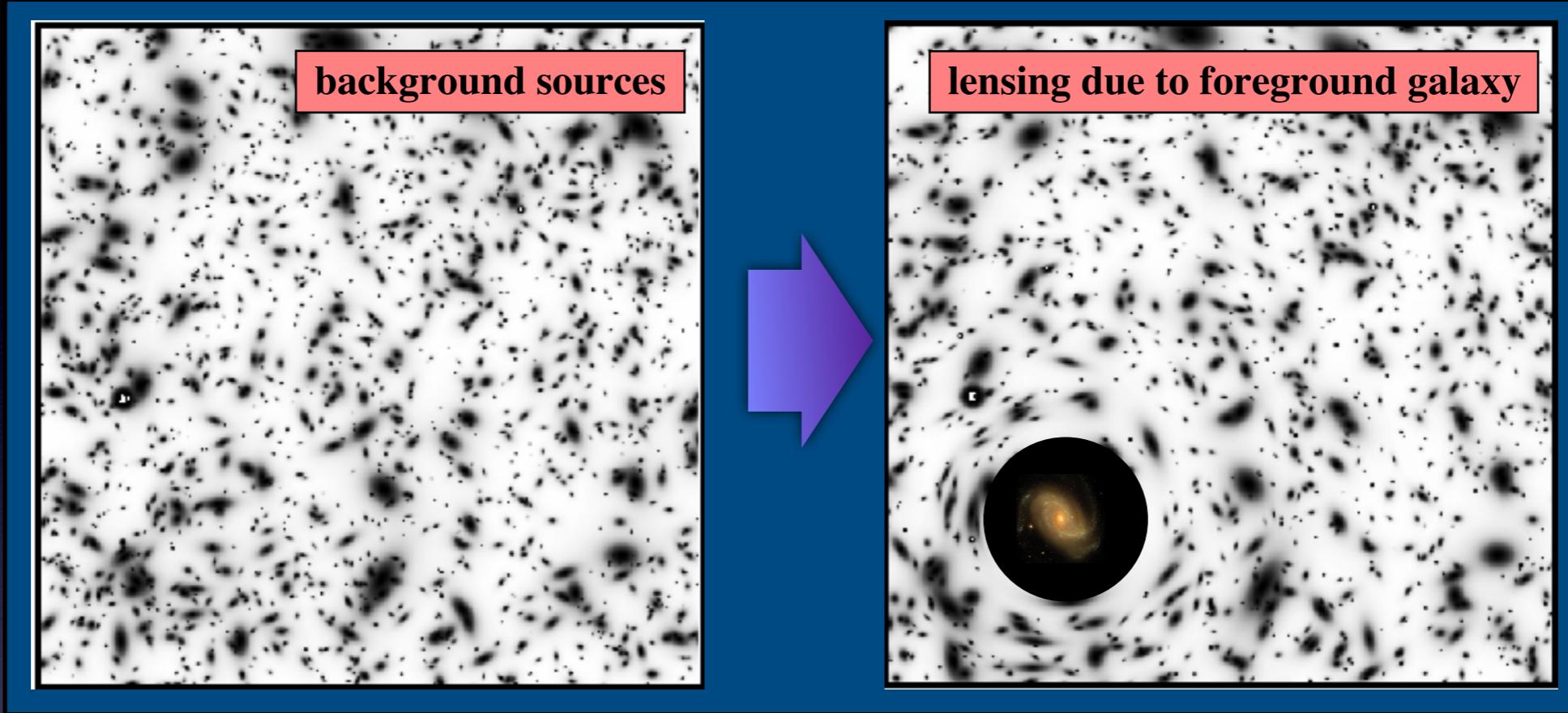
SHAM has only 2 degrees of freedom:  
halo property & scatter



# **Galaxy-Galaxy Lensing**

# Galaxy-Galaxy Lensing

The mass associated with galaxies lenses background galaxies



Lensing causes correlated ellipticities, the tangential shear,  $\gamma_t$ , which is related to the excess surface density,  $\Delta\Sigma$ , according to

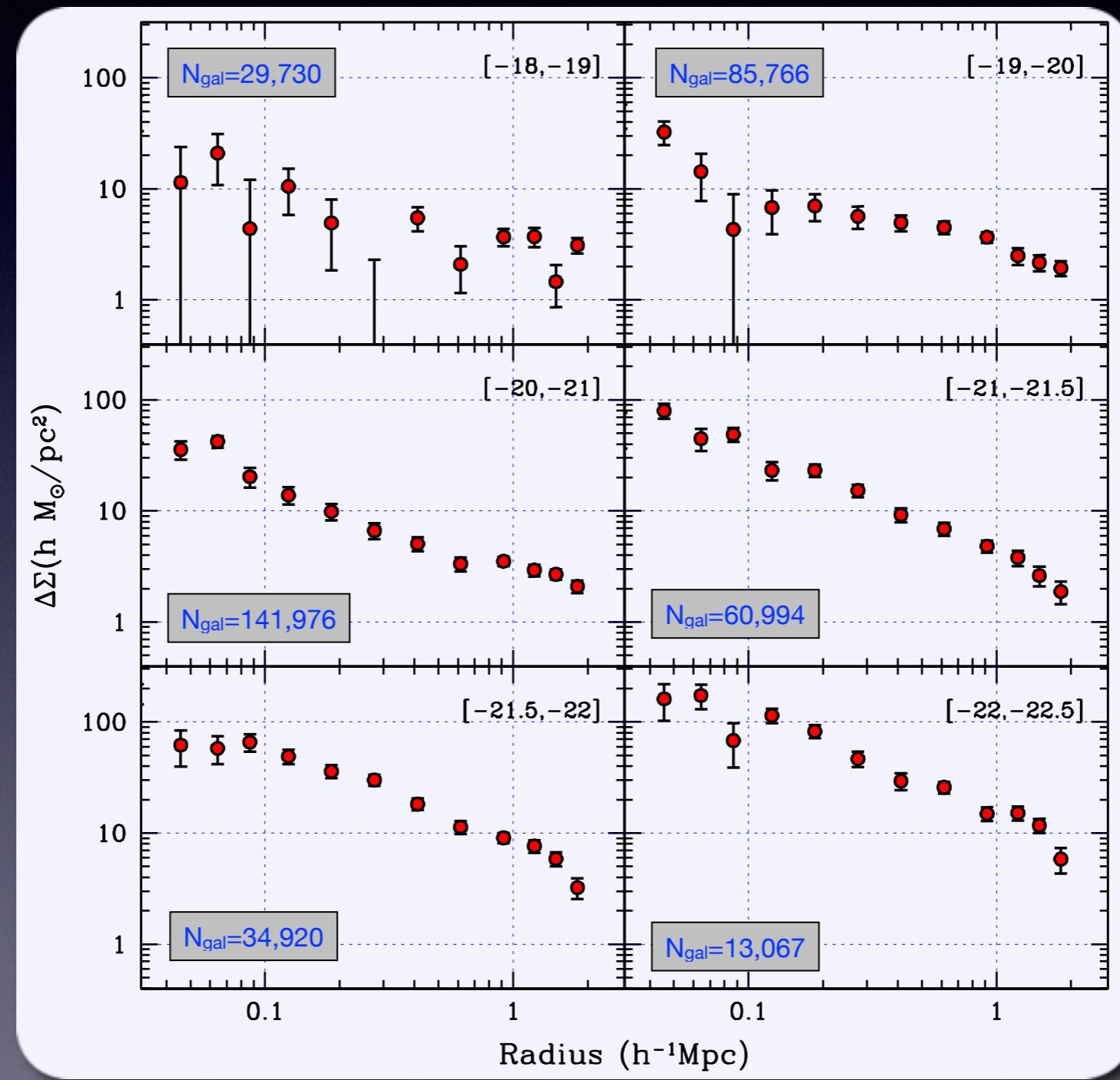
$$\gamma_t(R)\Sigma_{\text{crit}} = \Delta\Sigma(R) = \bar{\Sigma}(< R) - \Sigma(R)$$

$\Delta\Sigma$  is line-of-sight projection of galaxy-matter cross correlation

$$\Sigma(R) = \bar{\rho} \int_0^{D_s} [1 + \xi_{g,\text{dm}}(r)] d\chi$$

# Galaxy-Galaxy Lensing

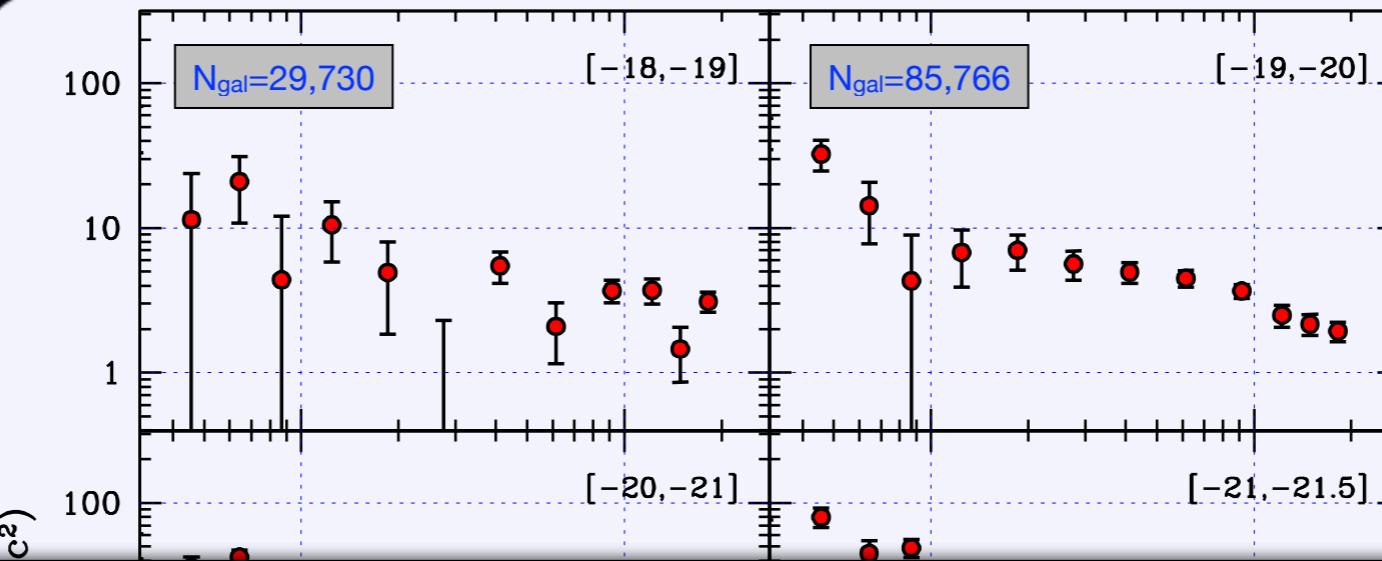
- Number of background sources per lens is limited
- Measuring shear with sufficient S/N requires **stacking** of many lenses



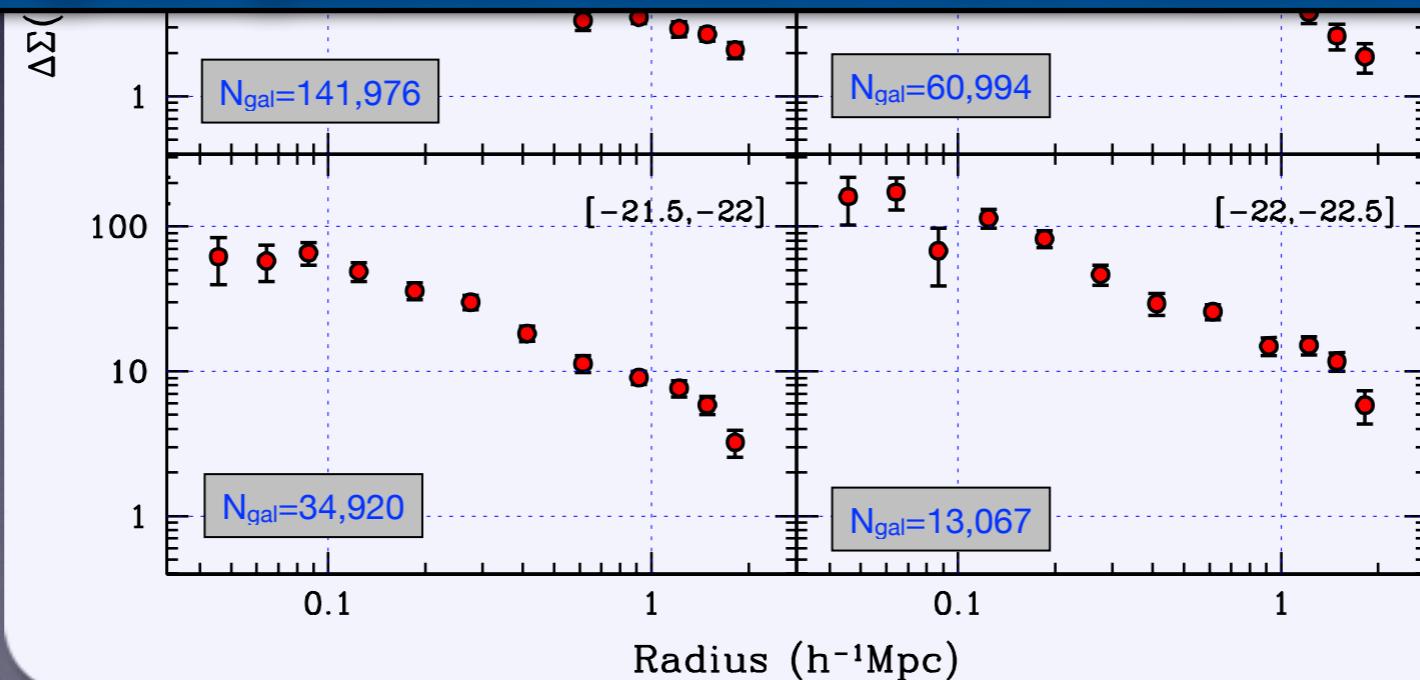
Mandelbaum et al. 2006

# Galaxy-Galaxy Lensing

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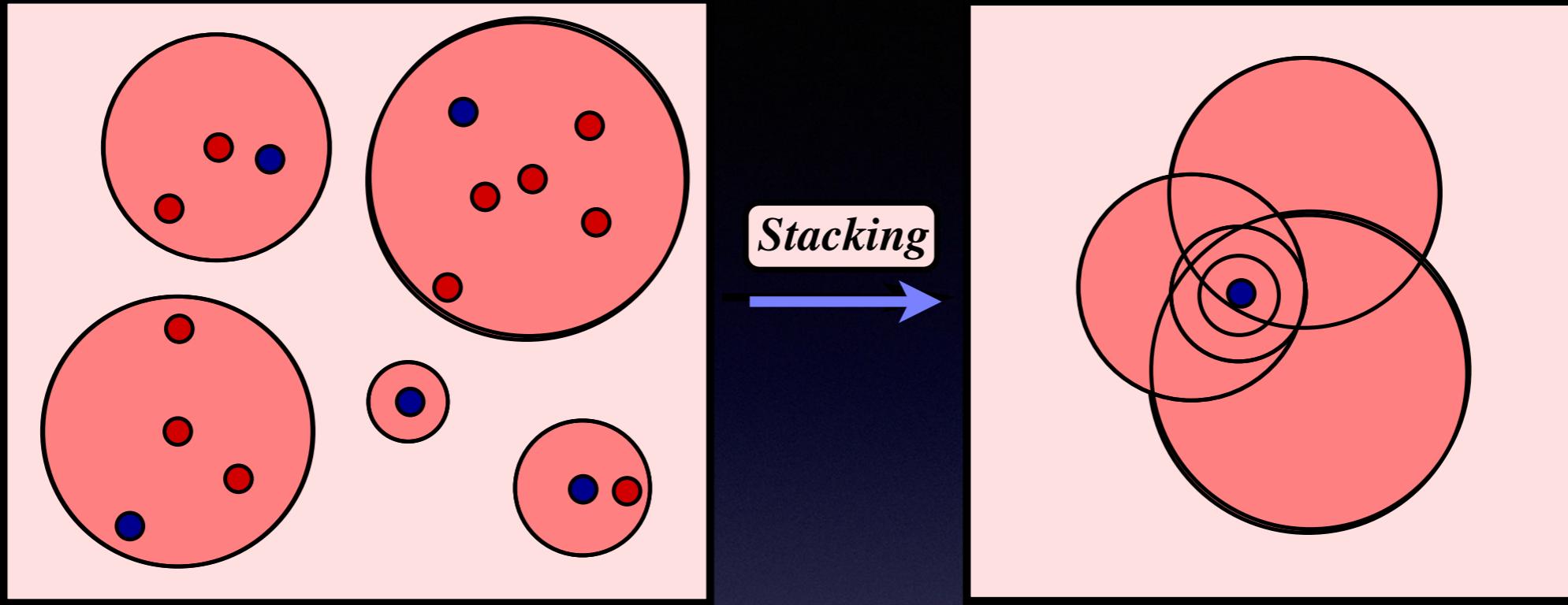


Brighter galaxies reside in more massive haloes



Mandelbaum et al. 2006

# Galaxy-Galaxy Lensing



Because of **stacking**, it is not straightforward to interpret lensing signal

In order to model the data, what is required is:

$$P_{\text{cen}}(M|L)$$

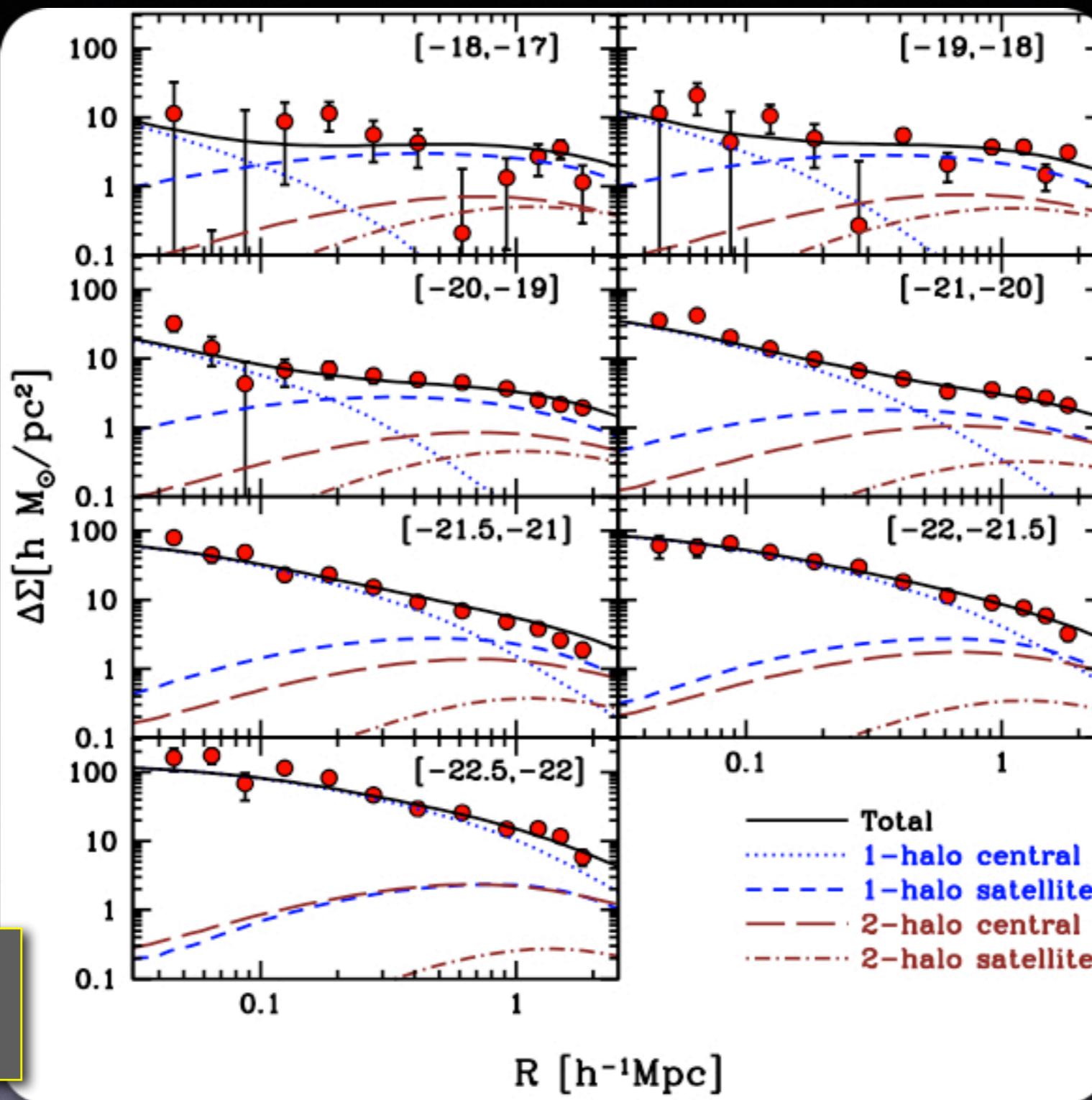
$$P_{\text{sat}}(M|L)$$

$$f_{\text{sat}}(L)$$

These can all be computed from the CLF...

For a given  $\Phi(L|M)$  we can **predict** the lensing signal  $\Delta\Sigma(R|L_1, L_2)$

# Galaxy-Galaxy Lensing



Galaxy-Galaxy Lensing can constrain halo occupation statistics

# Satellite Kinematics

# Probing Halo Mass with Satellite Kinematics



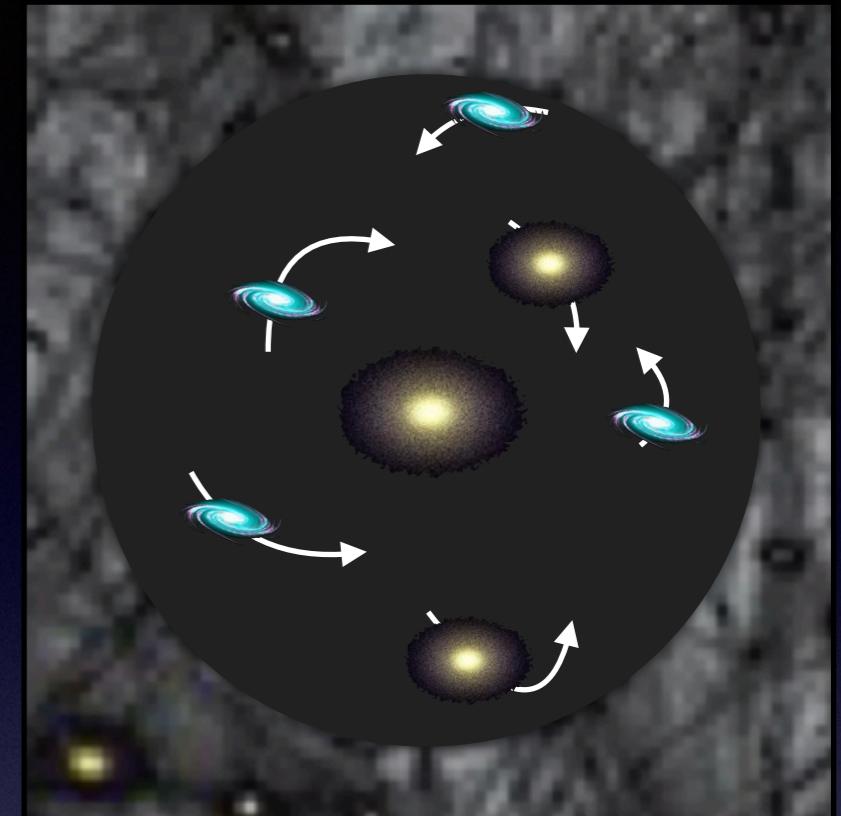
Coma Cluster

$$2K + W = 0$$



Virial  
Theorem

$$M \propto \frac{\langle R \rangle \sigma^2}{G}$$



**Die Rotverschiebung von extragalaktischen Nebeln**  
von F. Zwicky.  
(16. II. 33.)

Um, wie beobachtet, einen mittleren Dopplereffekt von 1000 km/sek oder mehr zu erhalten, müsste also die mittlere Dichte im Comasystem mindestens 400 mal grösser sein als die auf Grund von Beobachtungen an leuchtender Materie abgeleitete<sup>1</sup>). Falls sich dies bewahrheiten sollte, würde sich also das überraschende Resultat ergeben, dass **dunkle Materie** in sehr viel grösserer Dichte vorhanden ist als leuchtende Materie.

Zwicky, 1933, Helv. Phys. Acta, 6, 110

# Probing Halo Mass with Satellite Kinematics



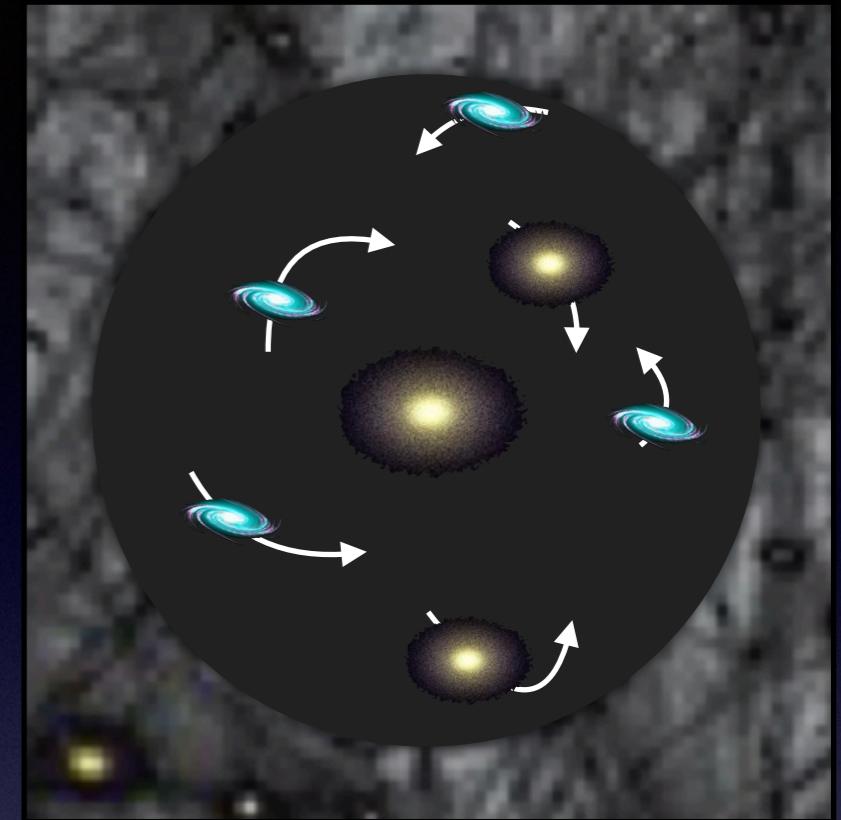
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Spherical  
Jeans  
Equations

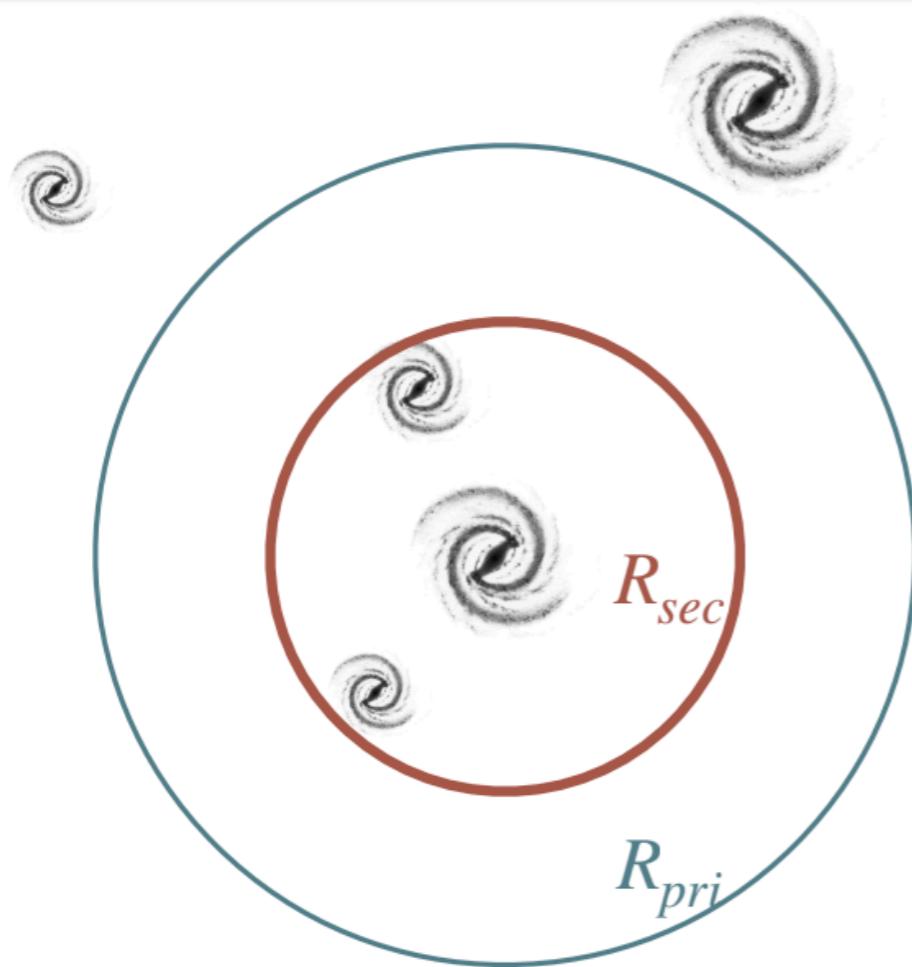


$$M(r) = -\frac{r\sigma_r^2}{G} \left[ \frac{d \ln n_{\text{sat}}}{d \ln r} + \frac{d \ln \sigma_r^2}{d \ln r} + 2\beta \right]$$

$$\text{anisotropy parameter } \beta = 1 - \frac{\sigma_t^2}{2\sigma_r^2}$$

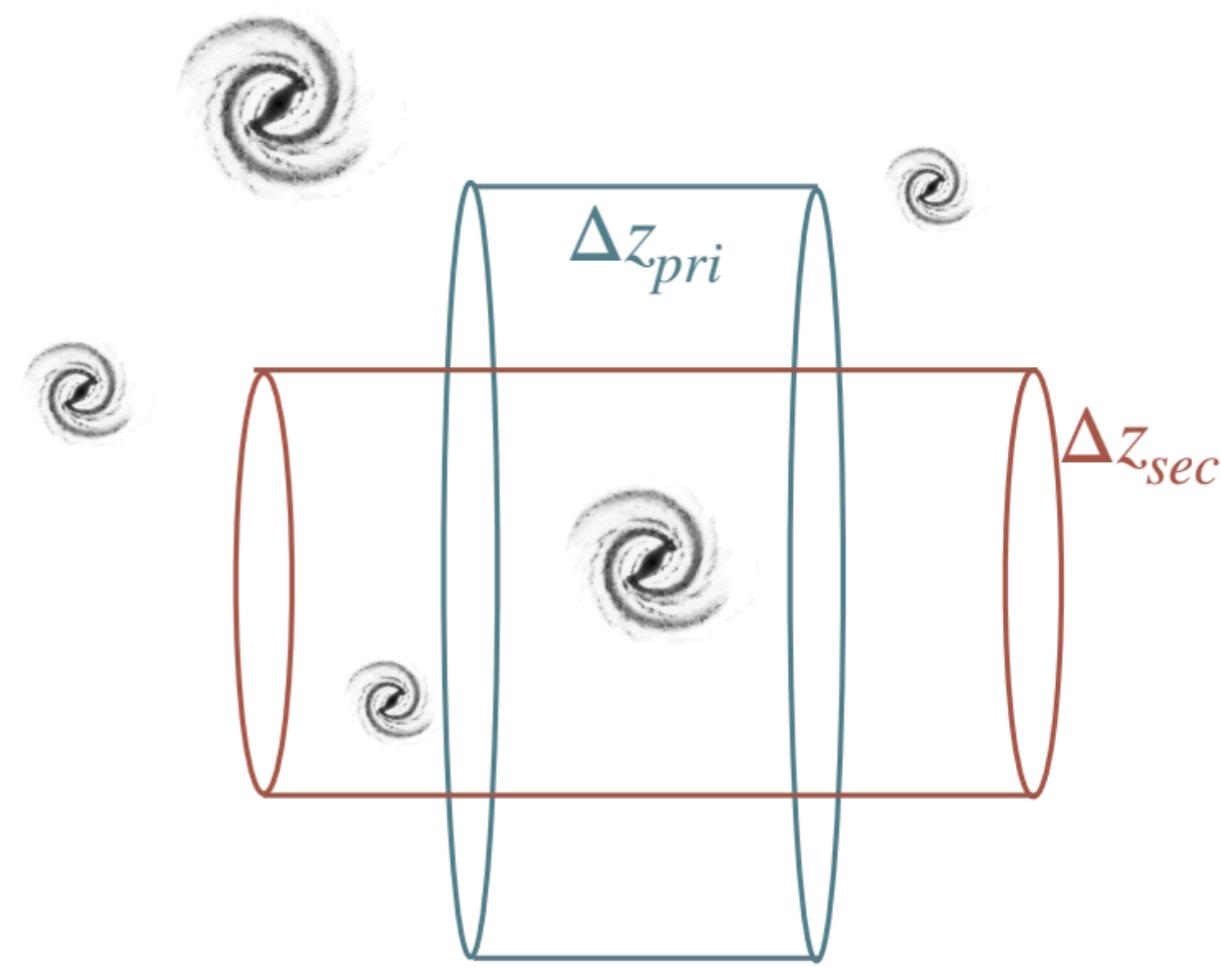
# Selecting Centrals & Satellites

Centrals ('primaries') are the brightest galaxies in their cylinder.  
Others are satellites ('secondaries')



face-on view

Cylinder sizes are optimized for purity and completeness (using mocks)



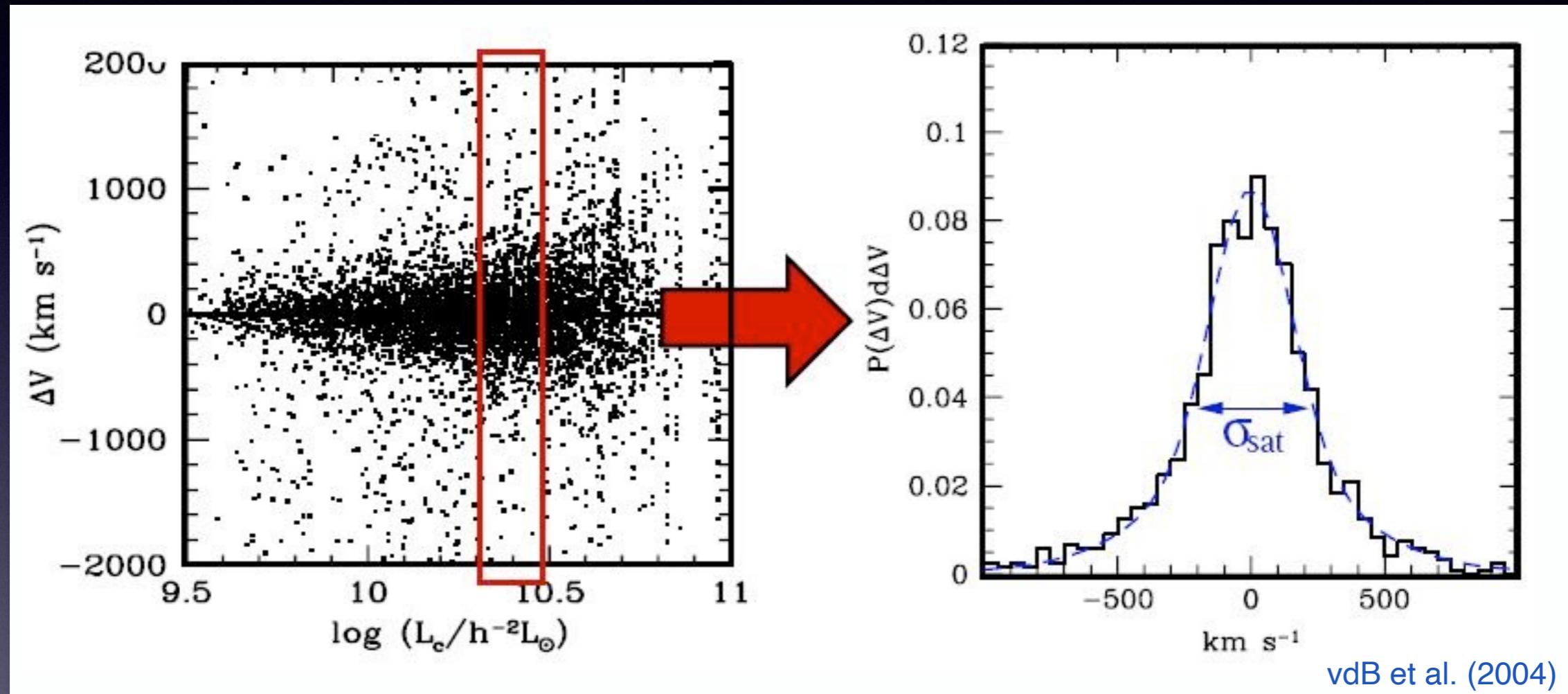
side view

# Satellite Kinematics



Select centrals and their satellites from a redshift survey

Using redshifts, determine  $\Delta V = V_{\text{sat}} - V_{\text{cen}}$  as function of  $L_c$



Compute satellite velocity dispersion,  $\sigma_{\text{sat}}$ , as function of  $L_c$

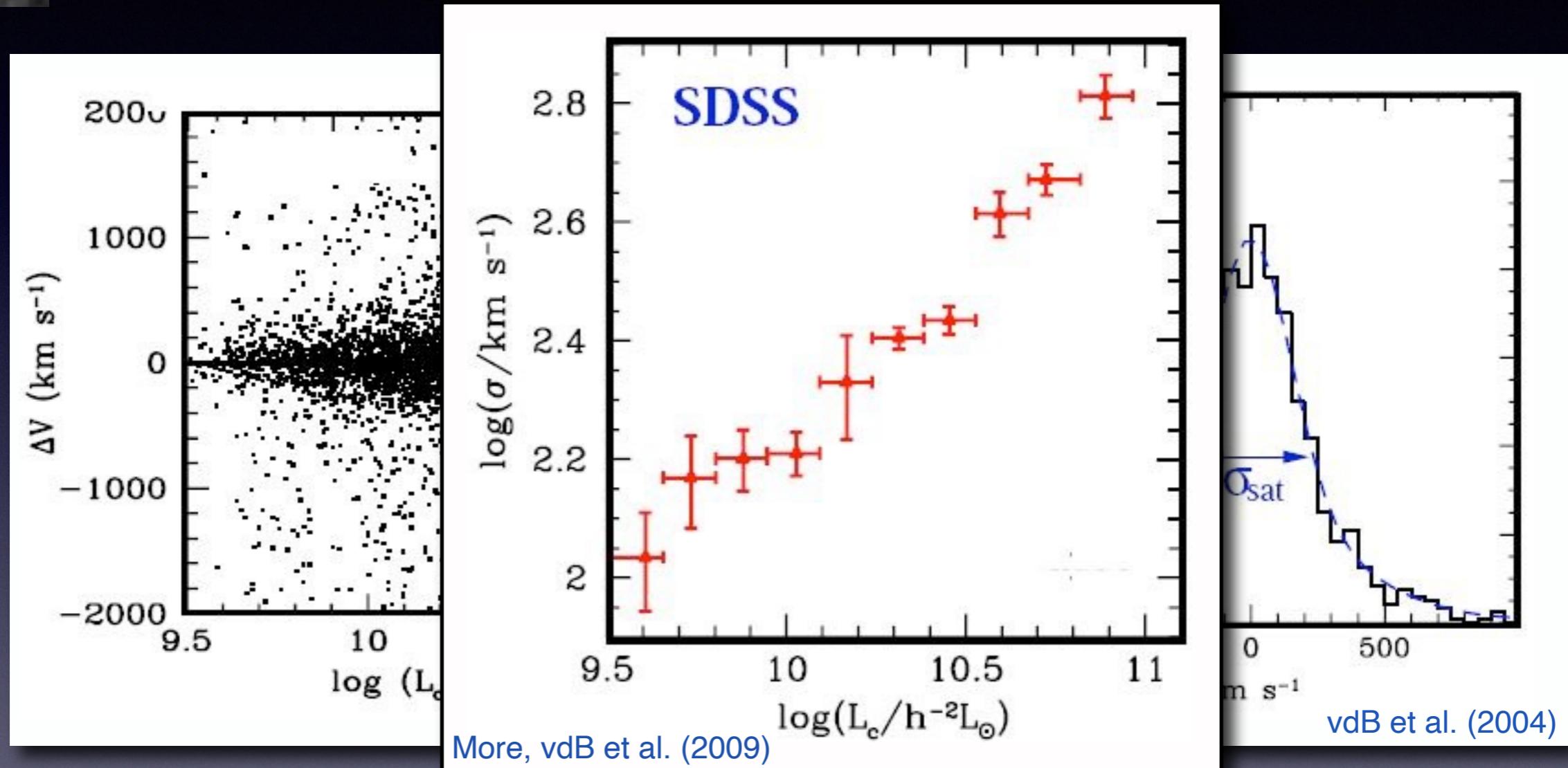
Use  $\sigma_{\text{sat}}(L_c)$  to constrain  $\Phi(L_c | M)$

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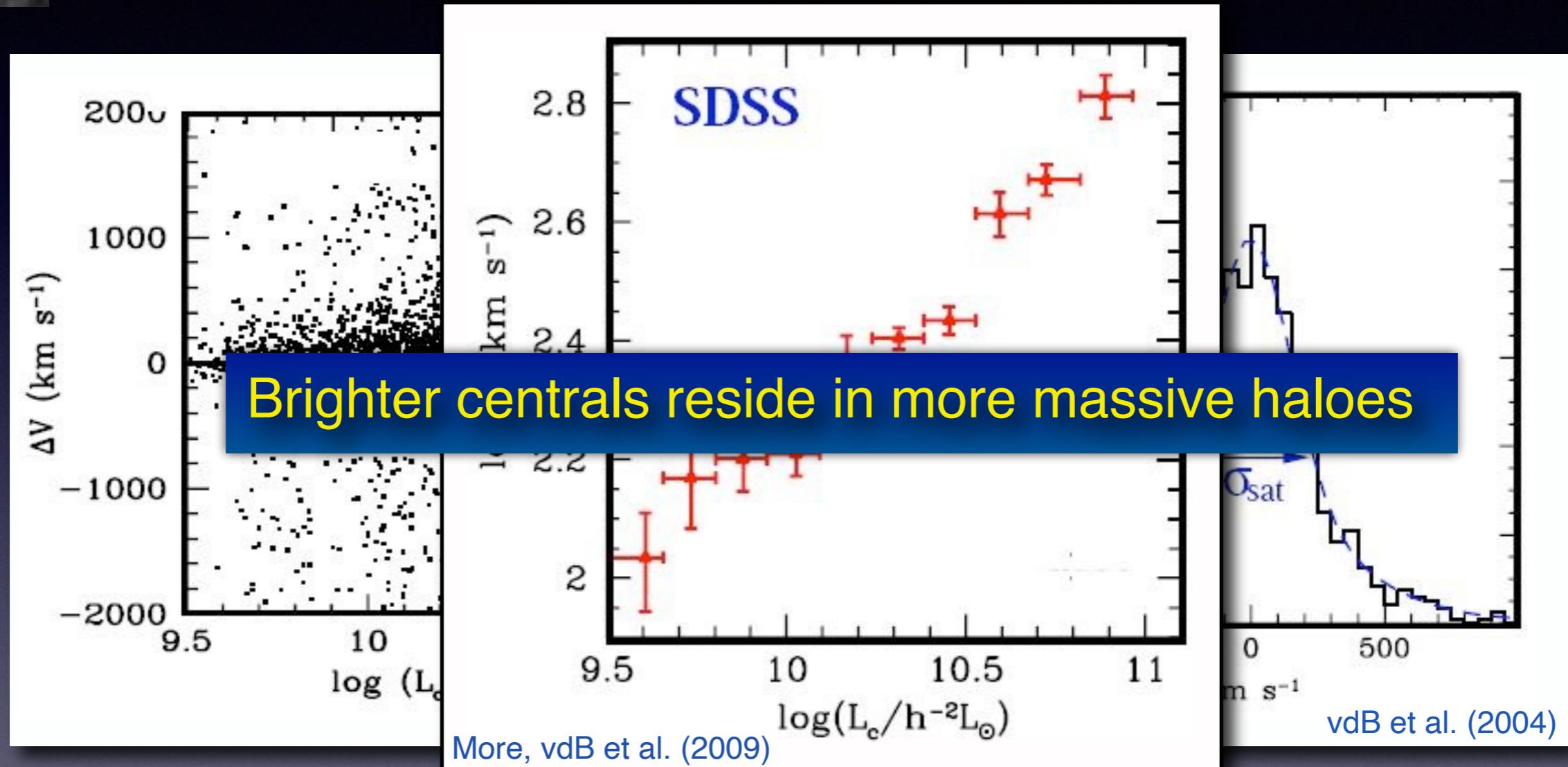
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# Satellite Kinematics



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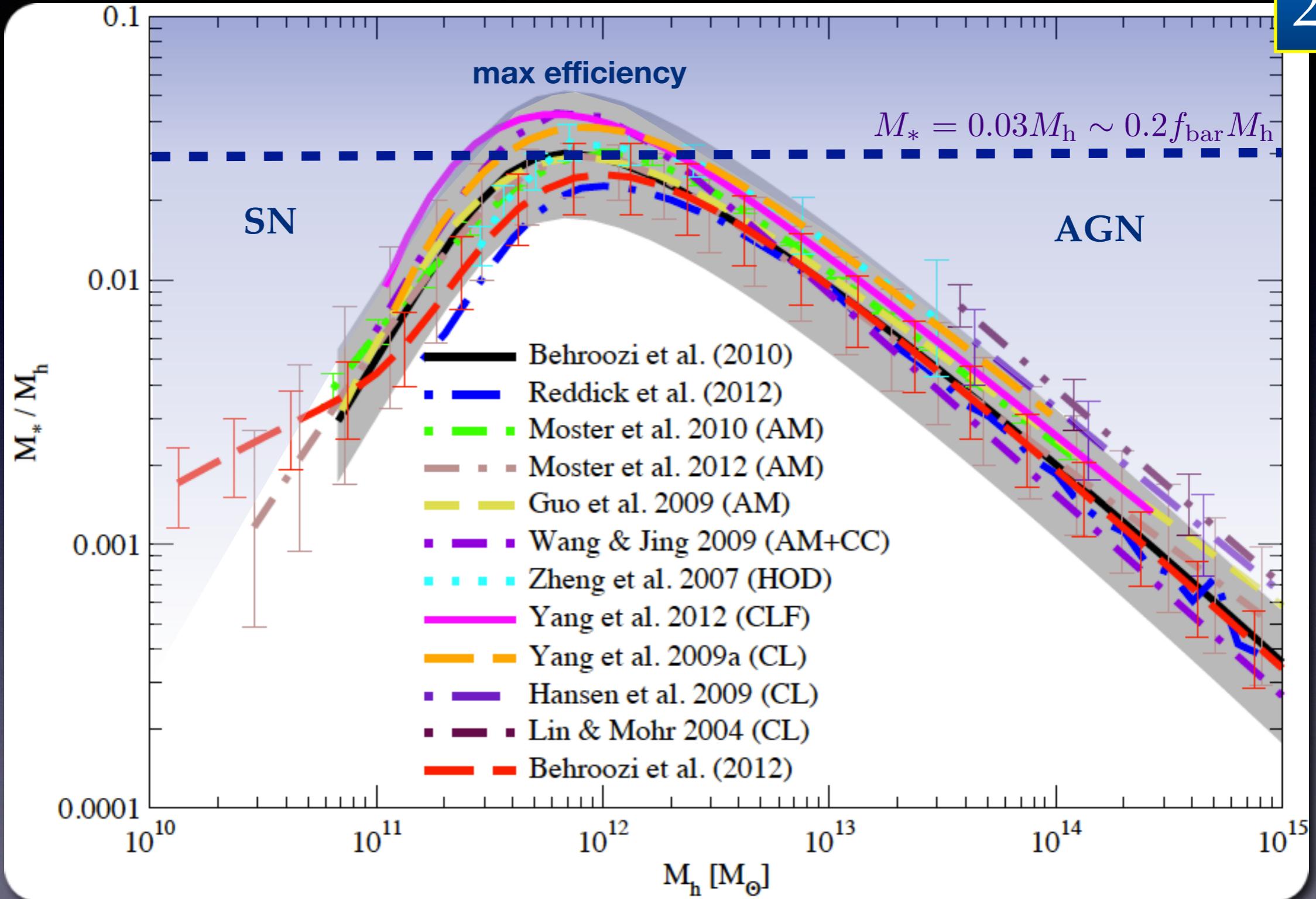
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# **Constraints on the Galaxy-Halo Connection**

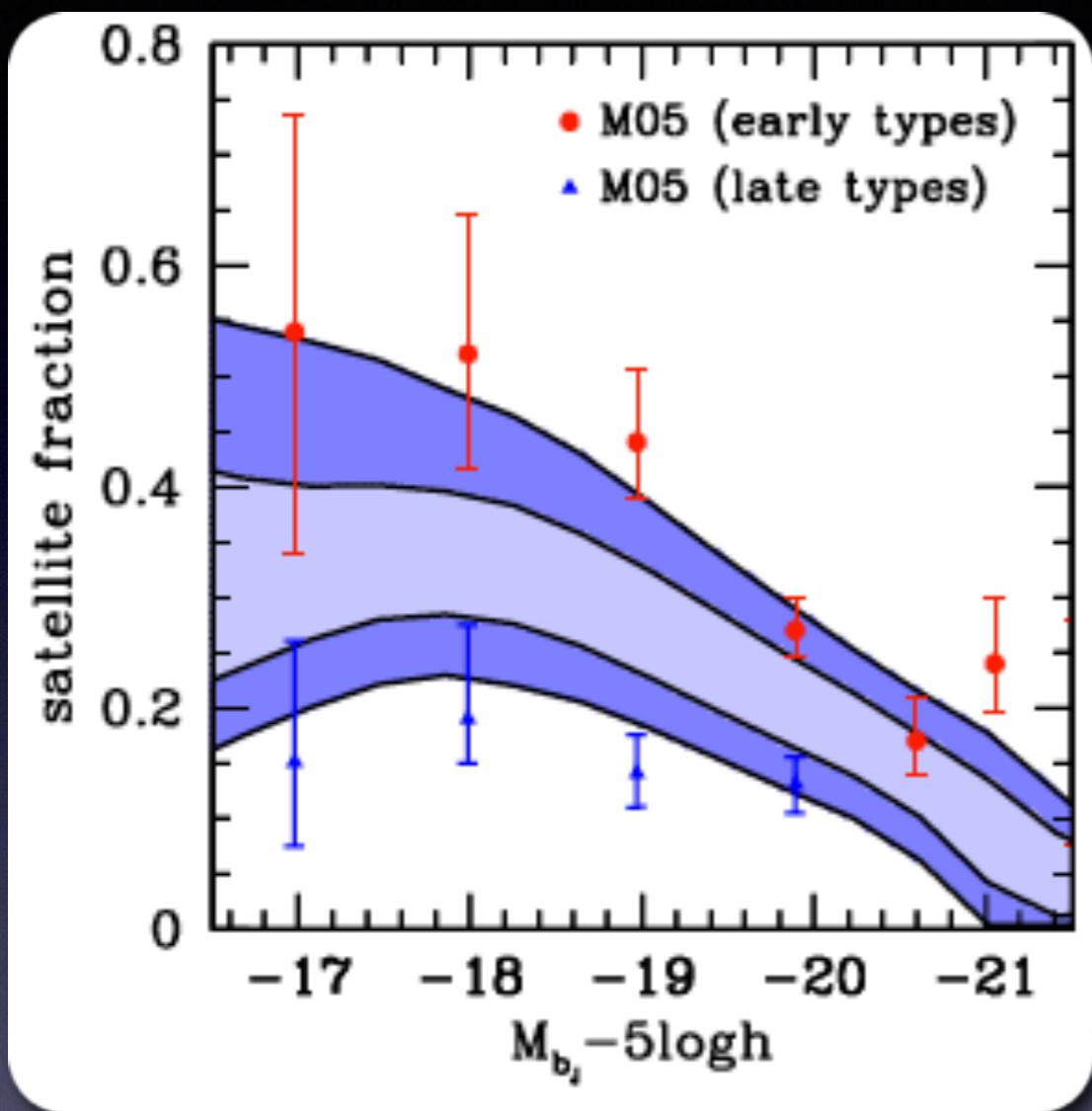
# The Stellar Mass - Halo Mass Relation

2013

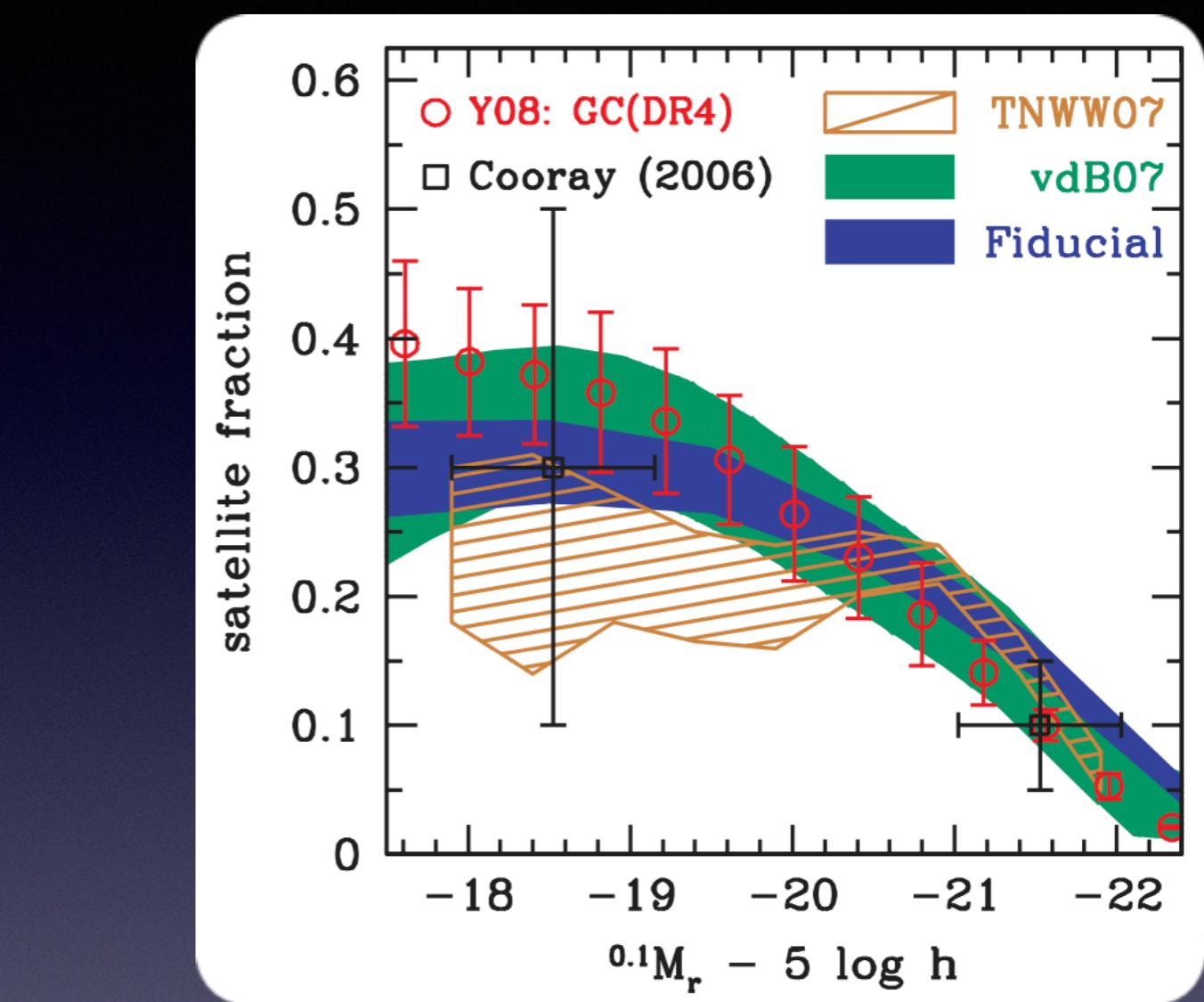


Source: Behroozi, Wechsler & Conroy, 2013

# Satellite Fractions



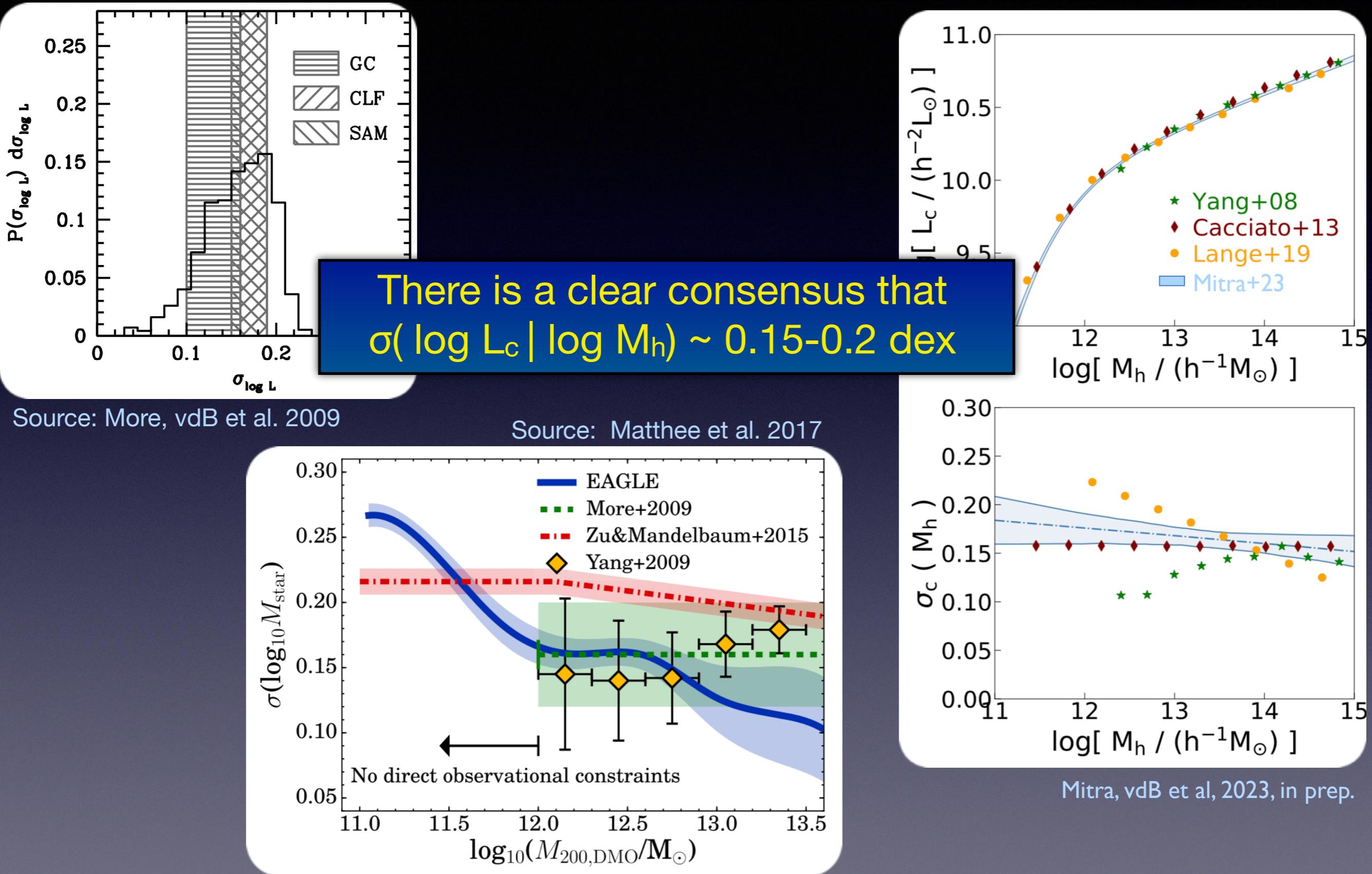
Source: van den Bosch et al. 2007



Source: Cacciato, vdB et al. 2013

Majority of galaxies of a given luminosity  
(or stellar mass) are centrals.

# Scatter in the SHMR

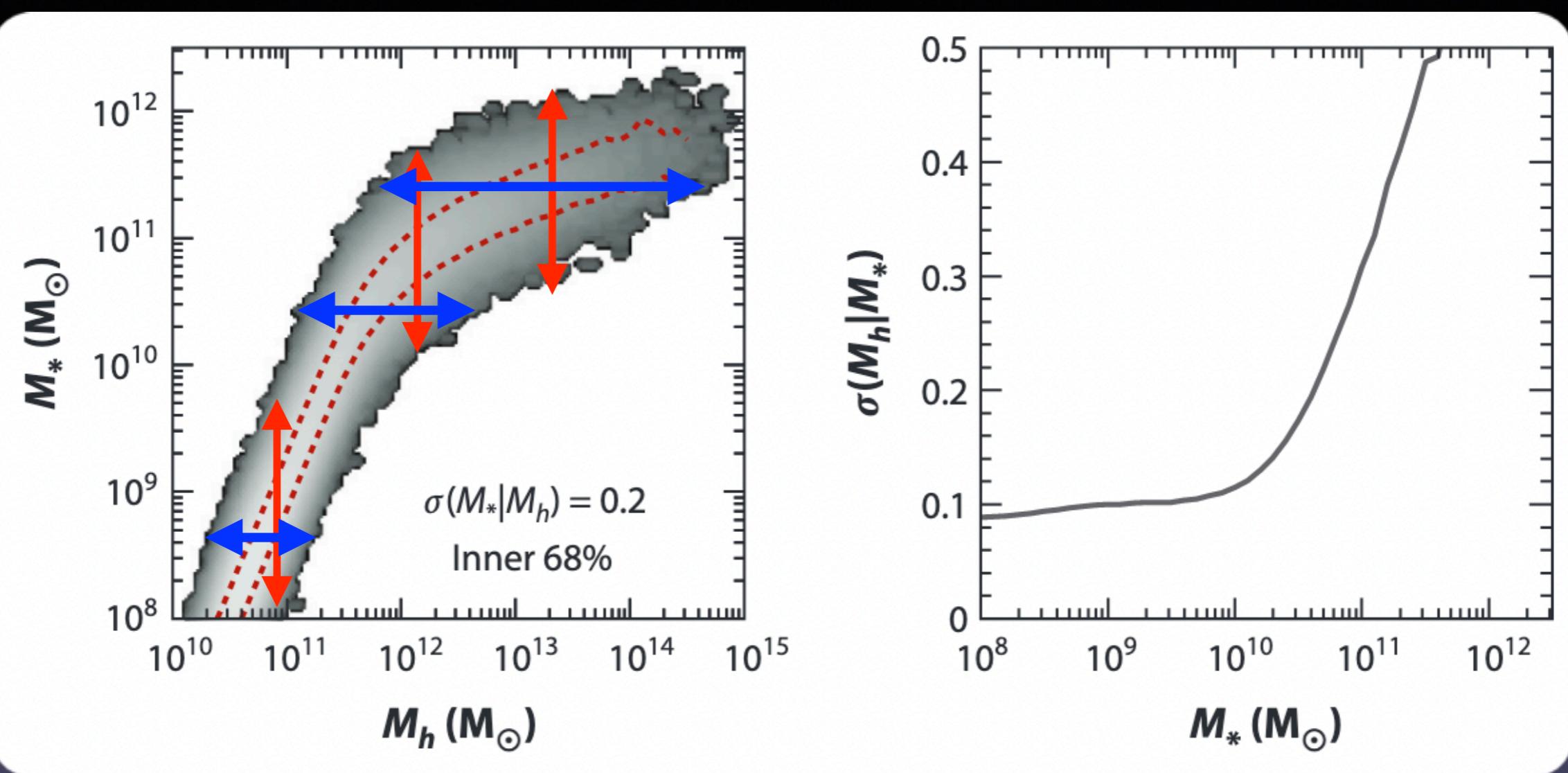


Source: More, vdB et al. 2009

Source: Matthee et al. 2017

Mitra, vdB et al, 2023, in prep.

# Scatter in SHMR



Source: Wechsler & Tinker 2018

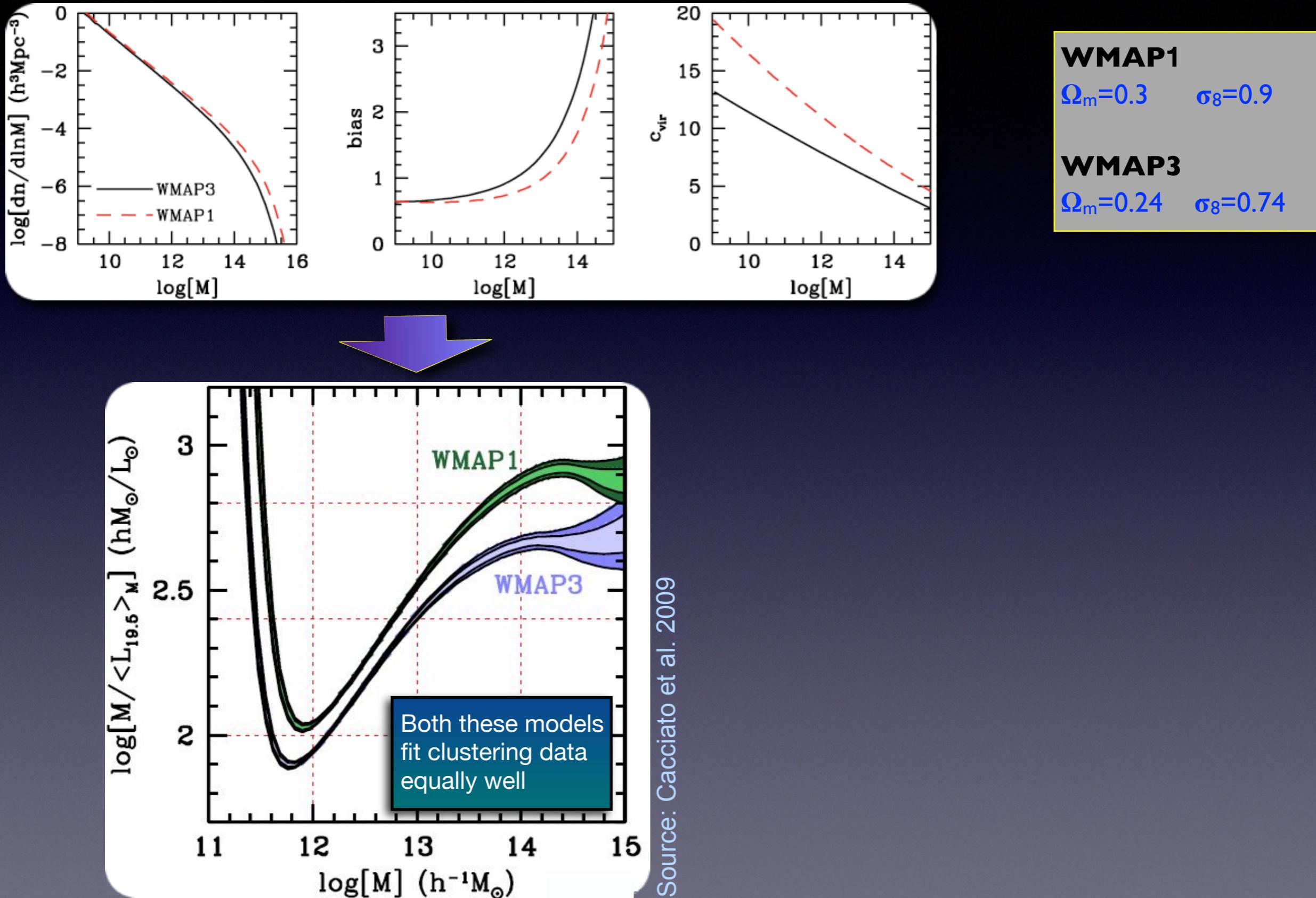
Scatter in halo mass at fixed luminosity  
increases strongly with stellar mass

Beware when stacking galaxies by stellar mass

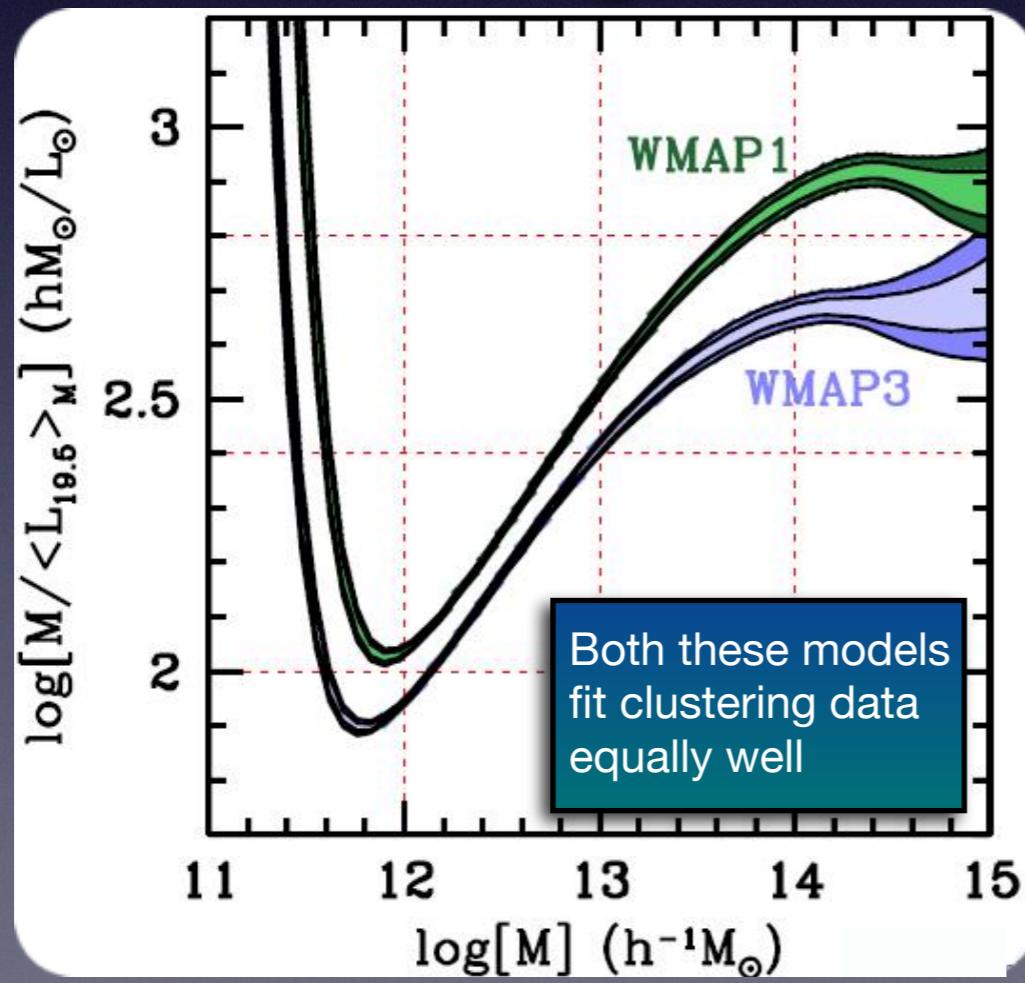
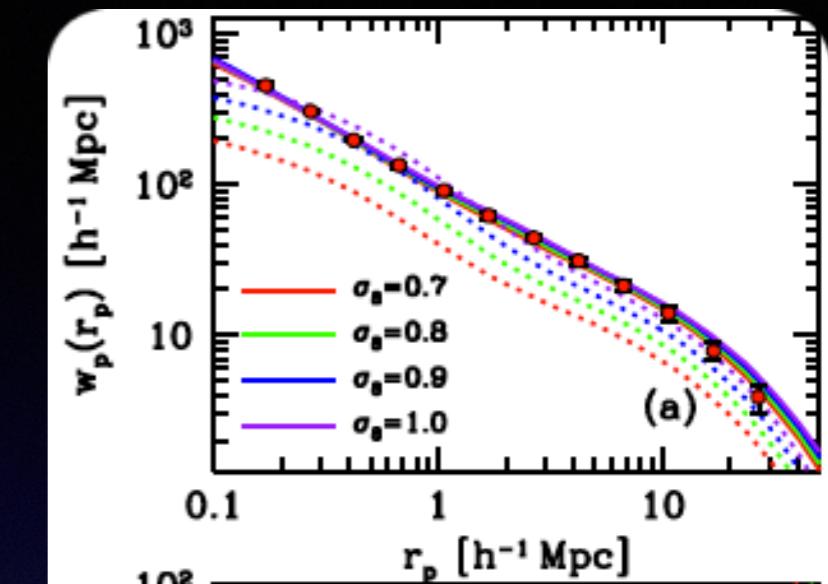
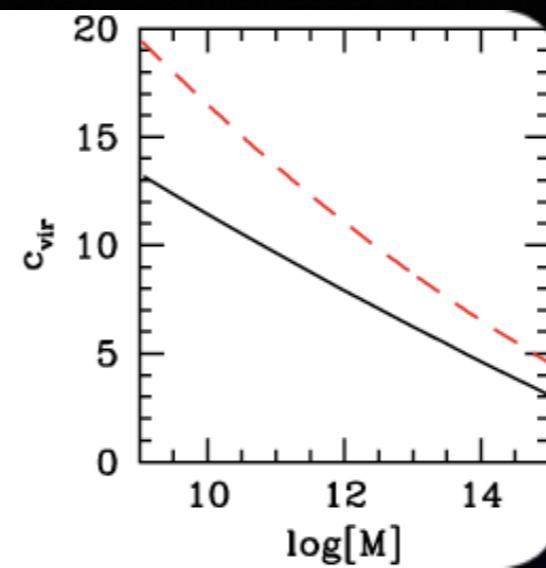
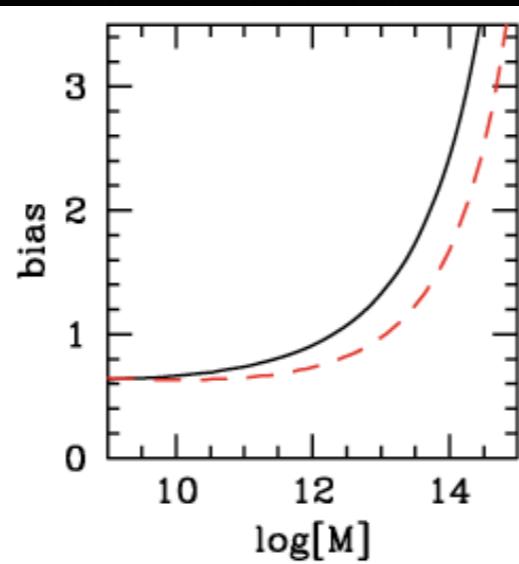
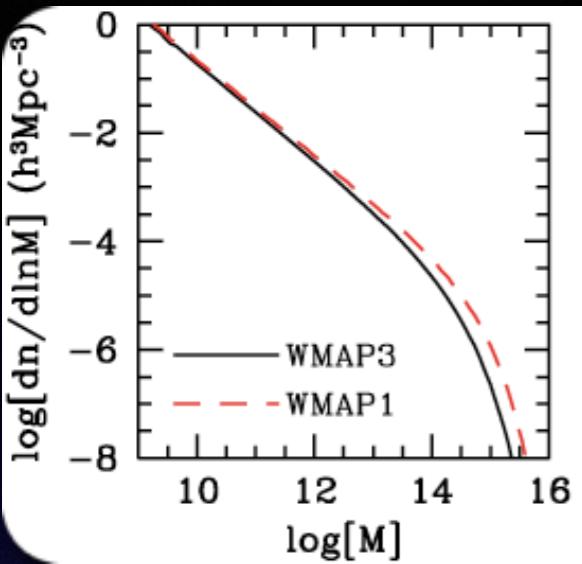


# Constraining Cosmology

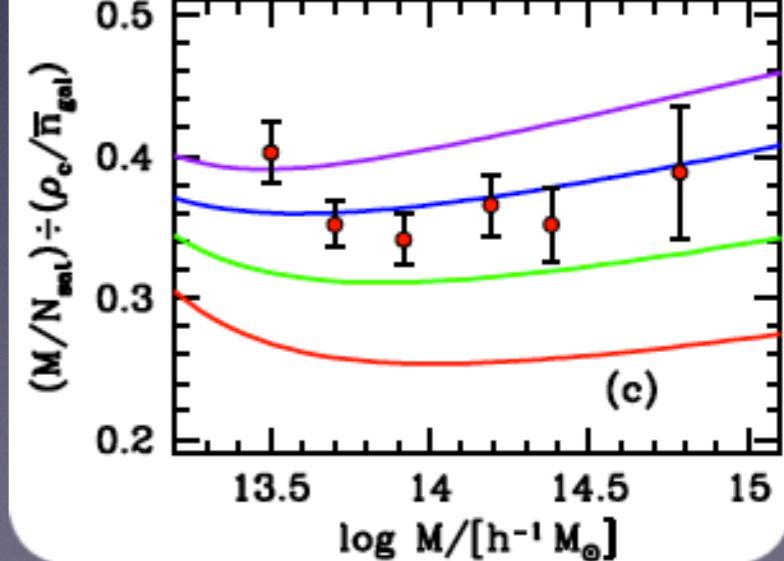
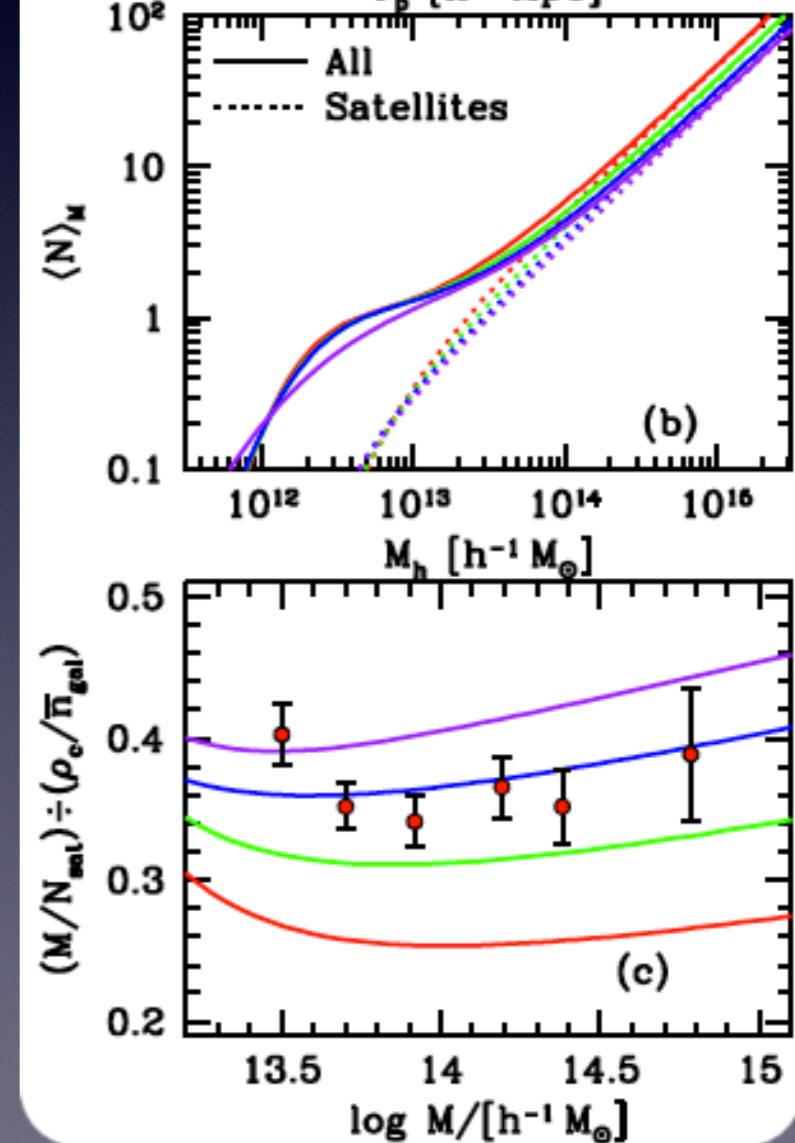
# Cosmology Dependence



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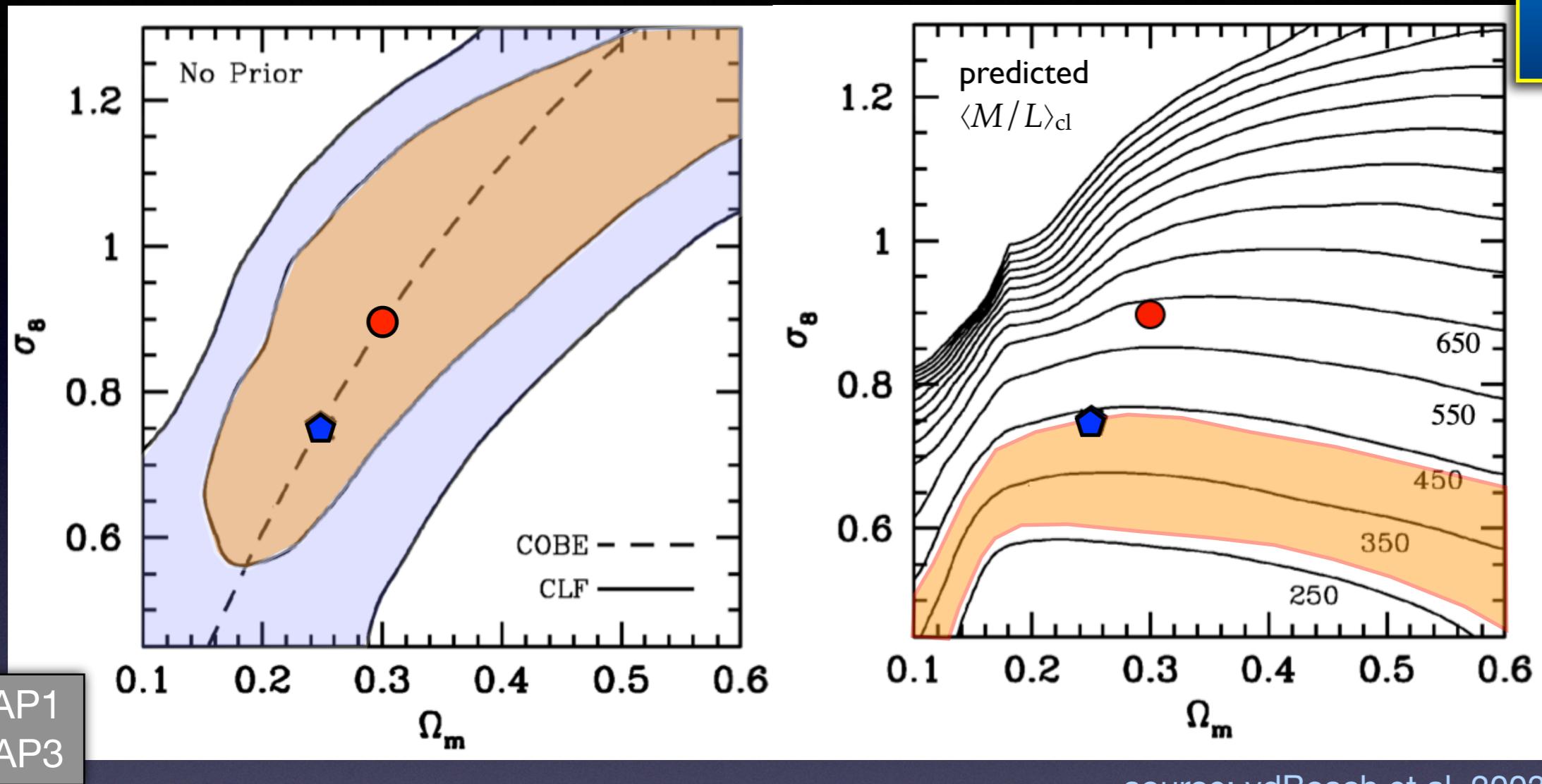
Source: Cacciato et al. 2009



Source: Tinker et al. 2012

# Cosmology Dependence

2003



source: vdBosch et al. 2003

Observational constraints  $\langle M/L \rangle_{\text{cl}} = 350 \pm 70 (M/L)_\odot$  suggest low values for  $\Omega_m$  and  $\sigma_8$

Carlberg+96; Bahcall+00;

These were early manifestations of the  $S_8$  tension

see also Yang et al. 2004; Tinker et al. 2005

# Cosmology Dependence

**Breaking degeneracies between cosmology and galaxy-halo connection requires methods that directly constrain halo mass**



**Galaxy-Galaxy  
lensing**

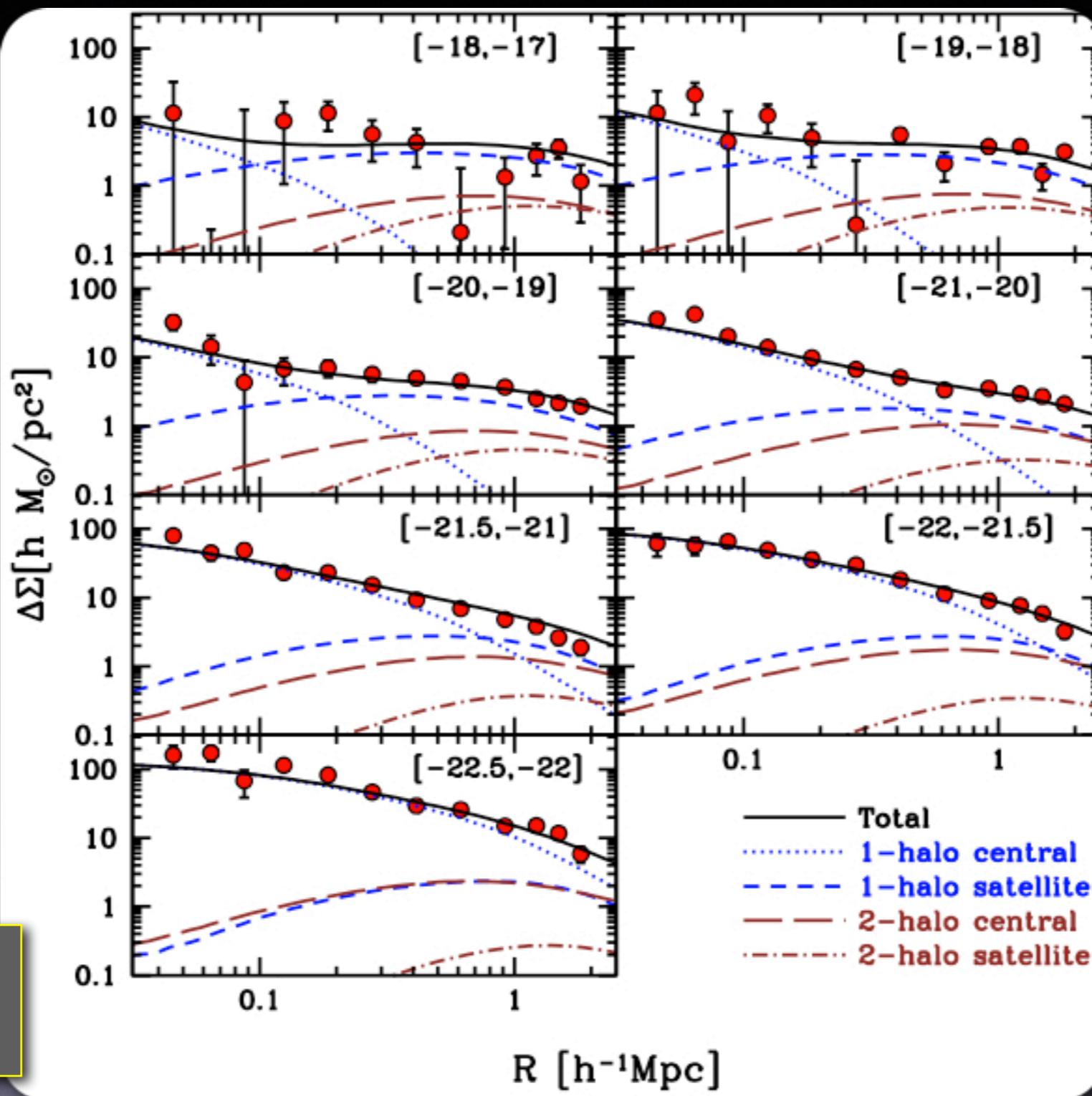


**Redshift-space  
distortions (RSD)**



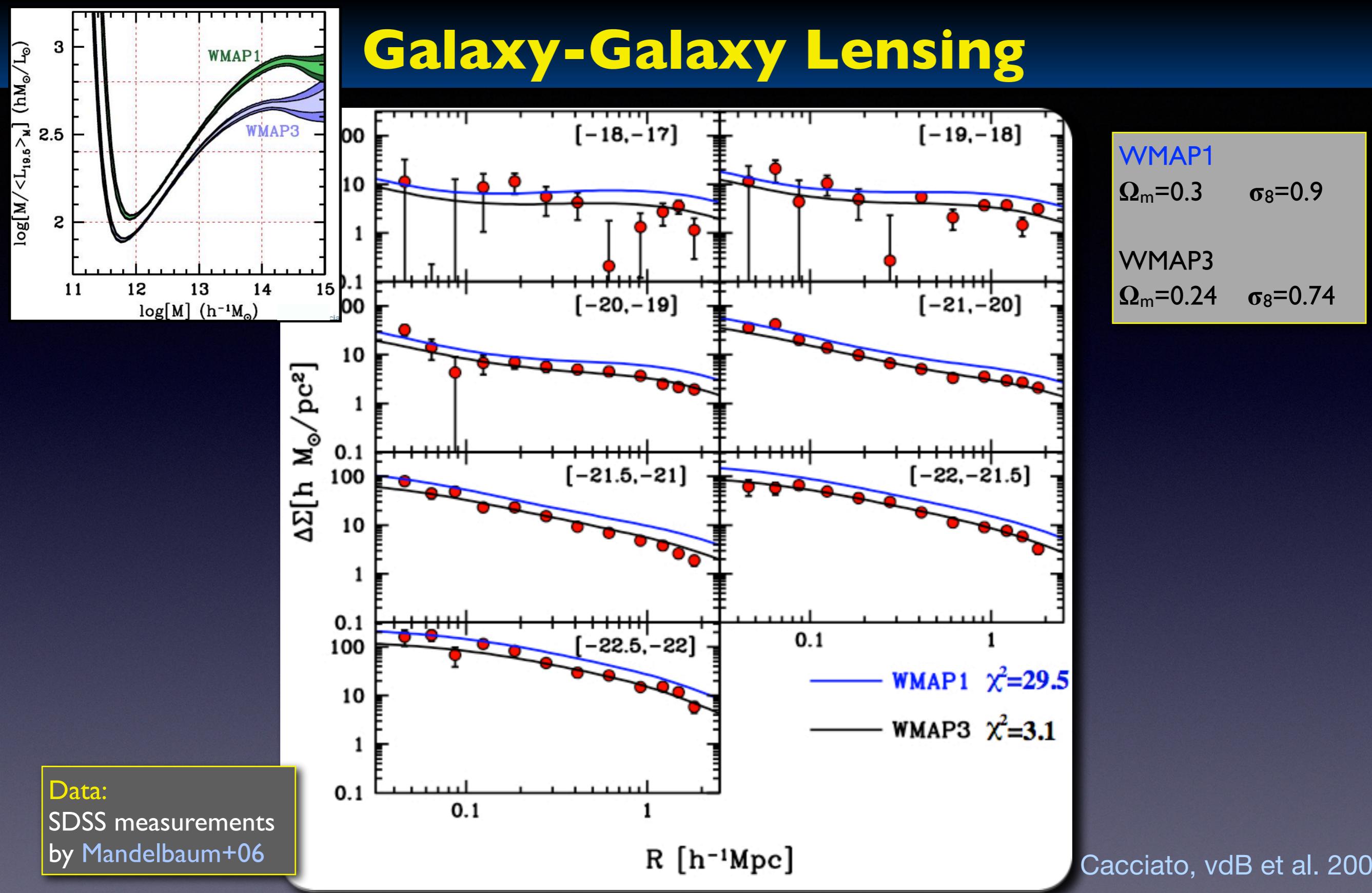
**Satellite  
kinematics**

# Galaxy-Galaxy Lensing



NOTE: this is not a fit, but a prediction based on CLF

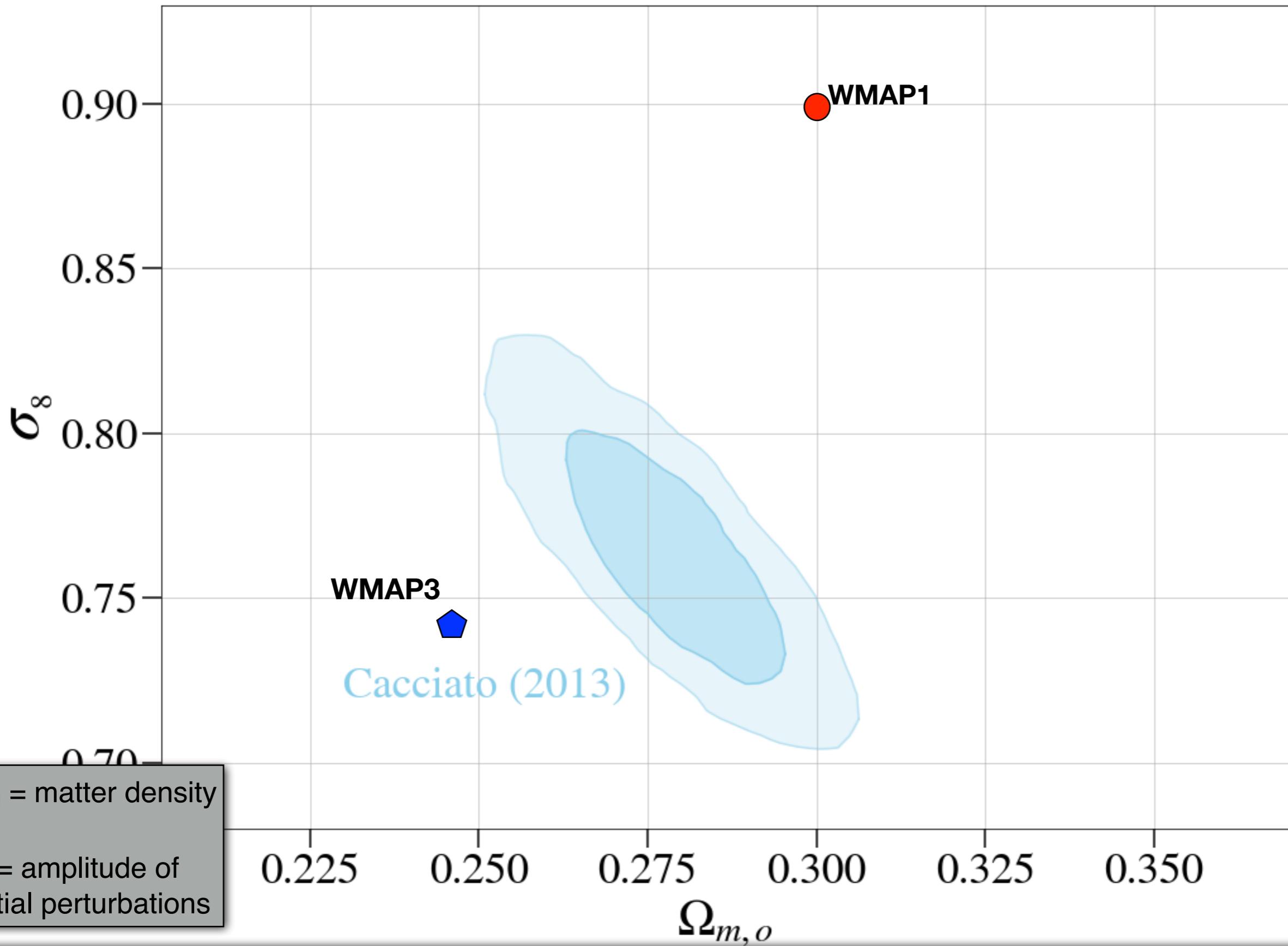
# Galaxy-Galaxy Lensing



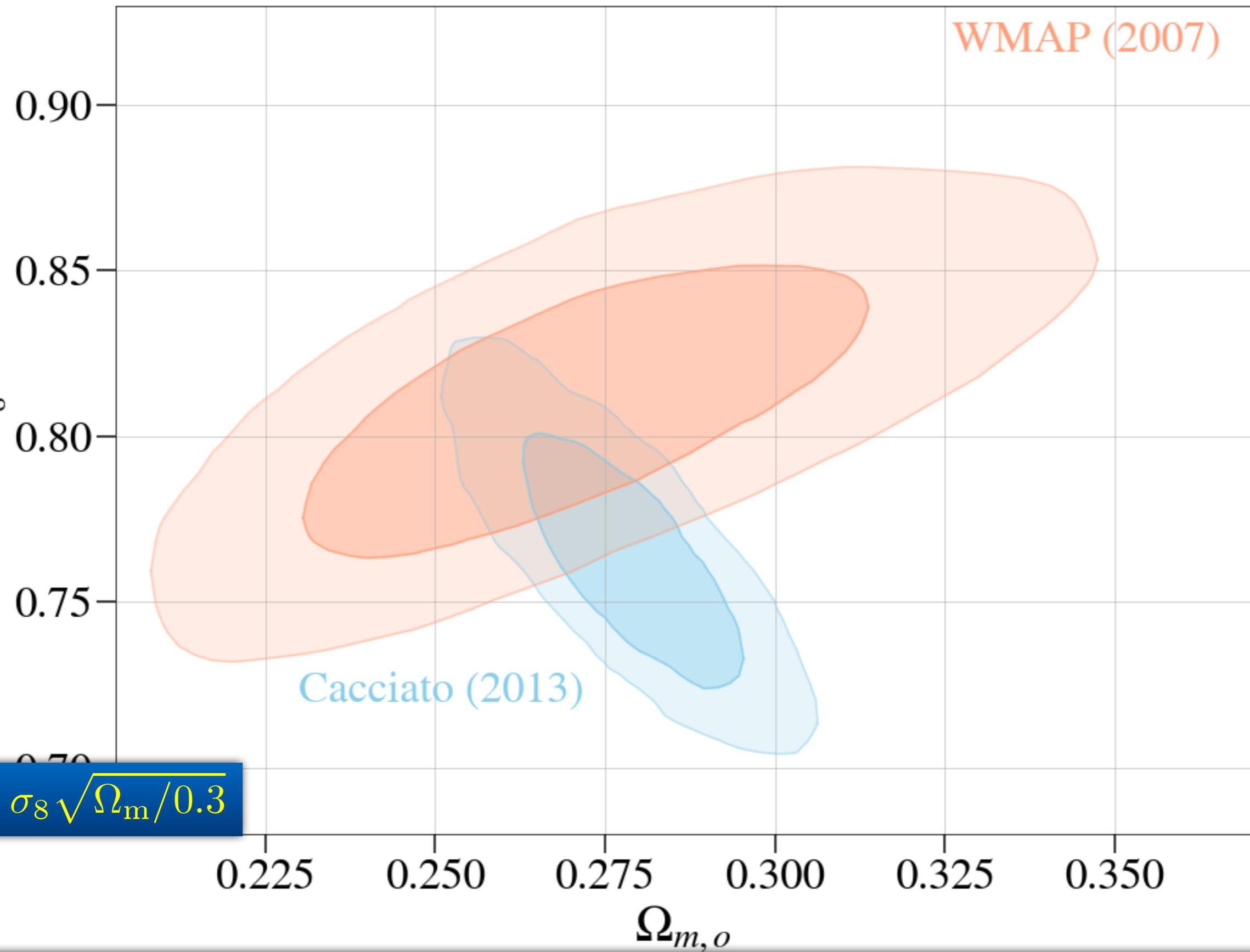
Cacciato, vdB et al. 2009

Combination of clustering & lensing can constrain cosmology!!!

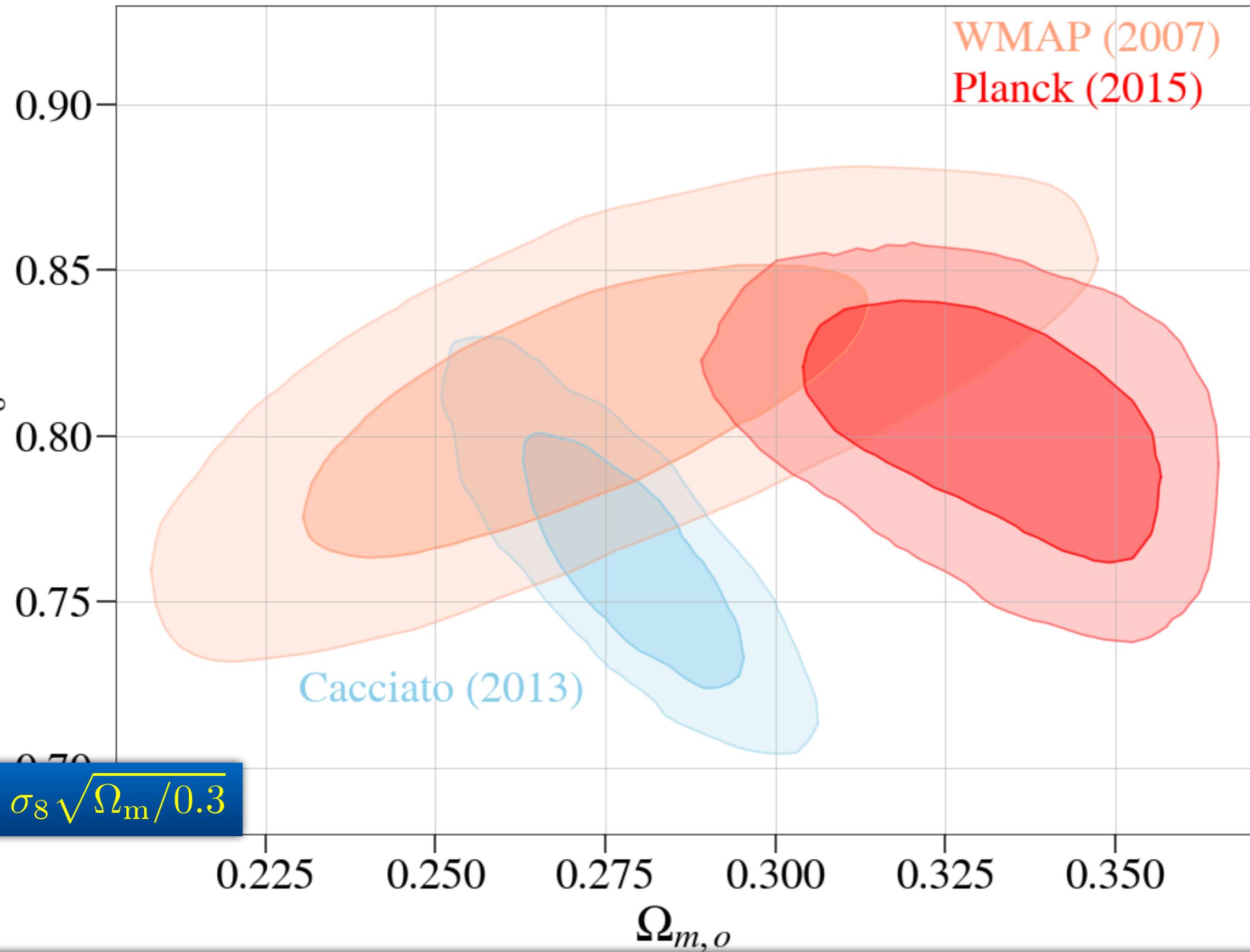
# The $S_8$ Tension



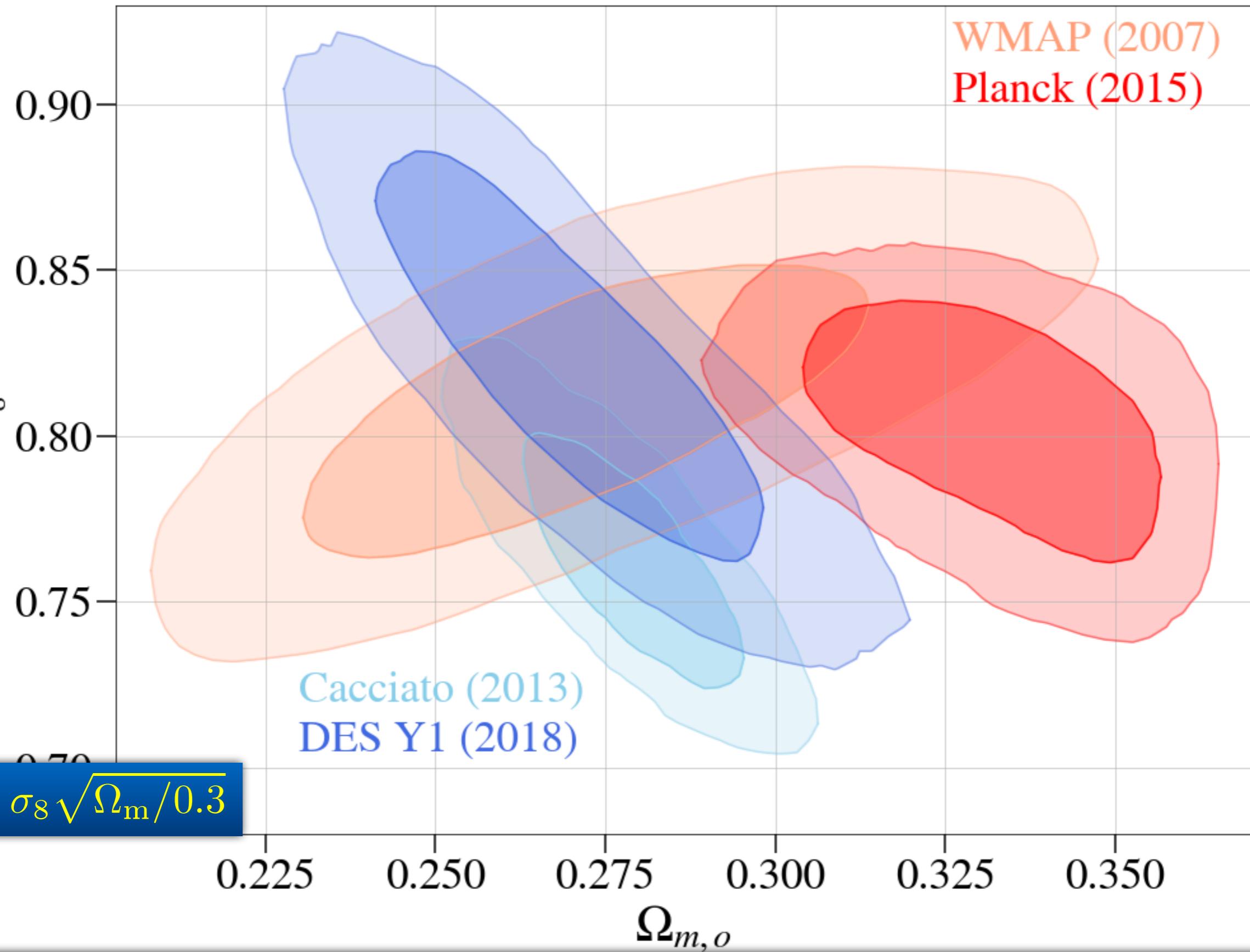
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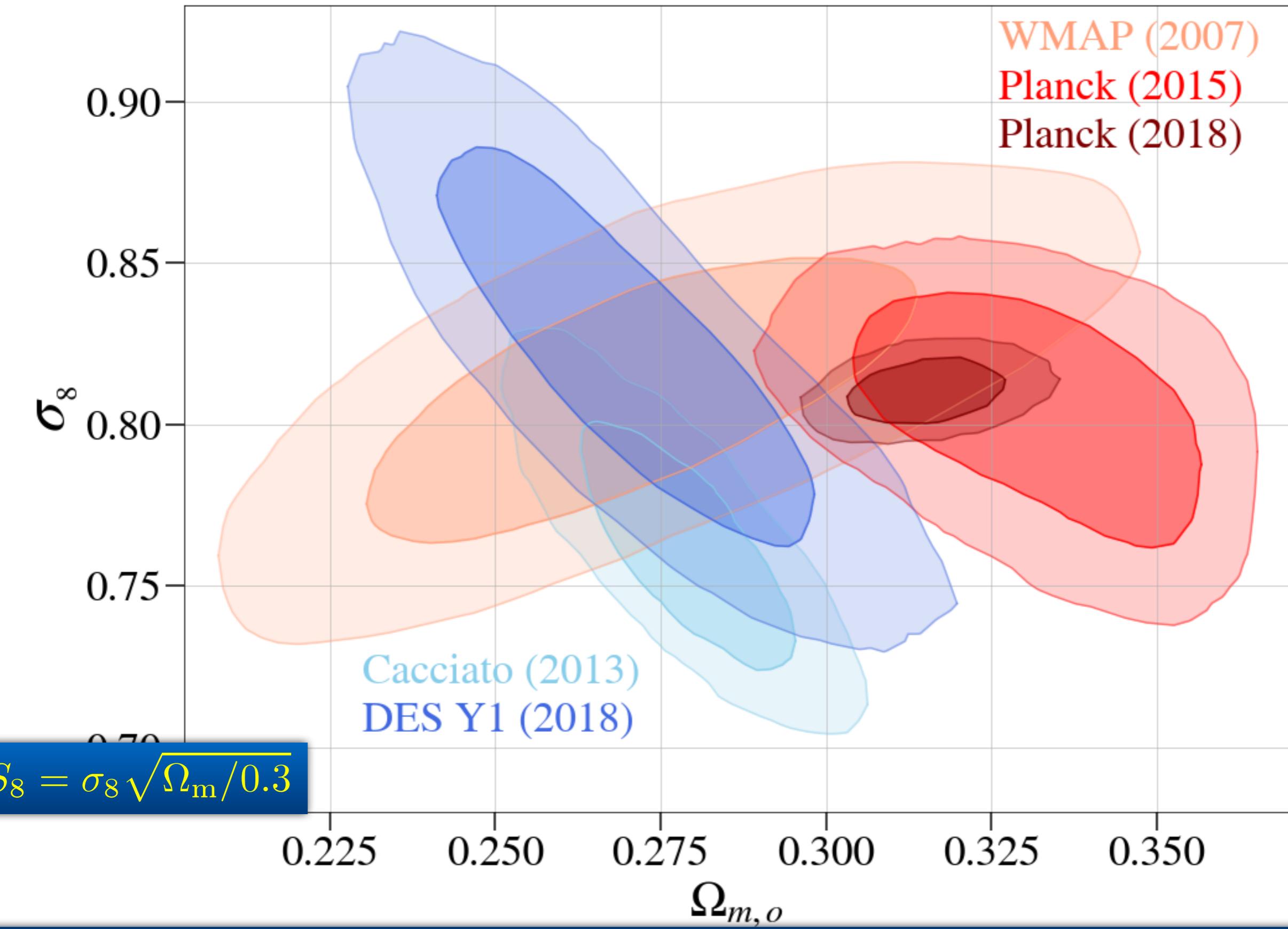
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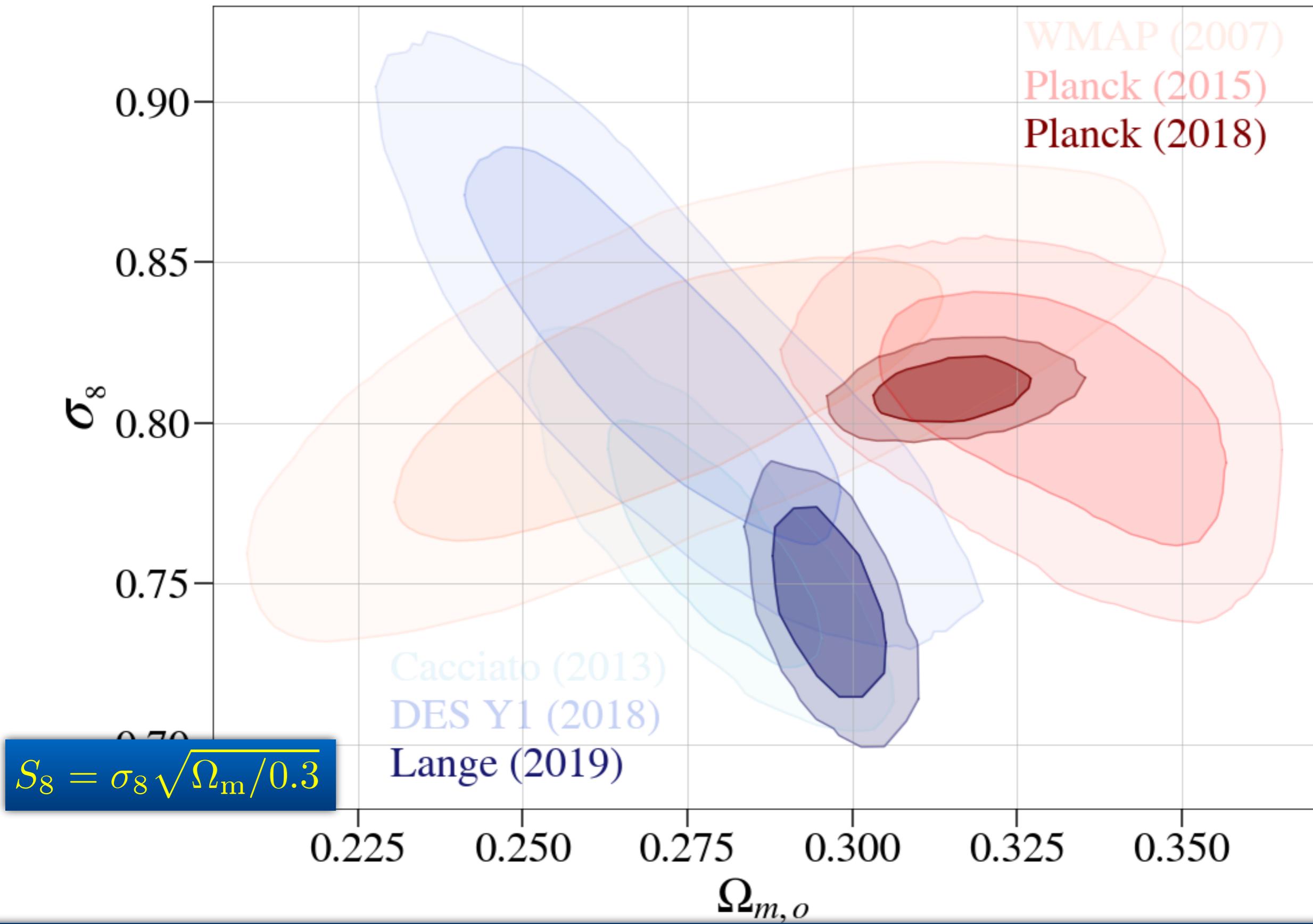
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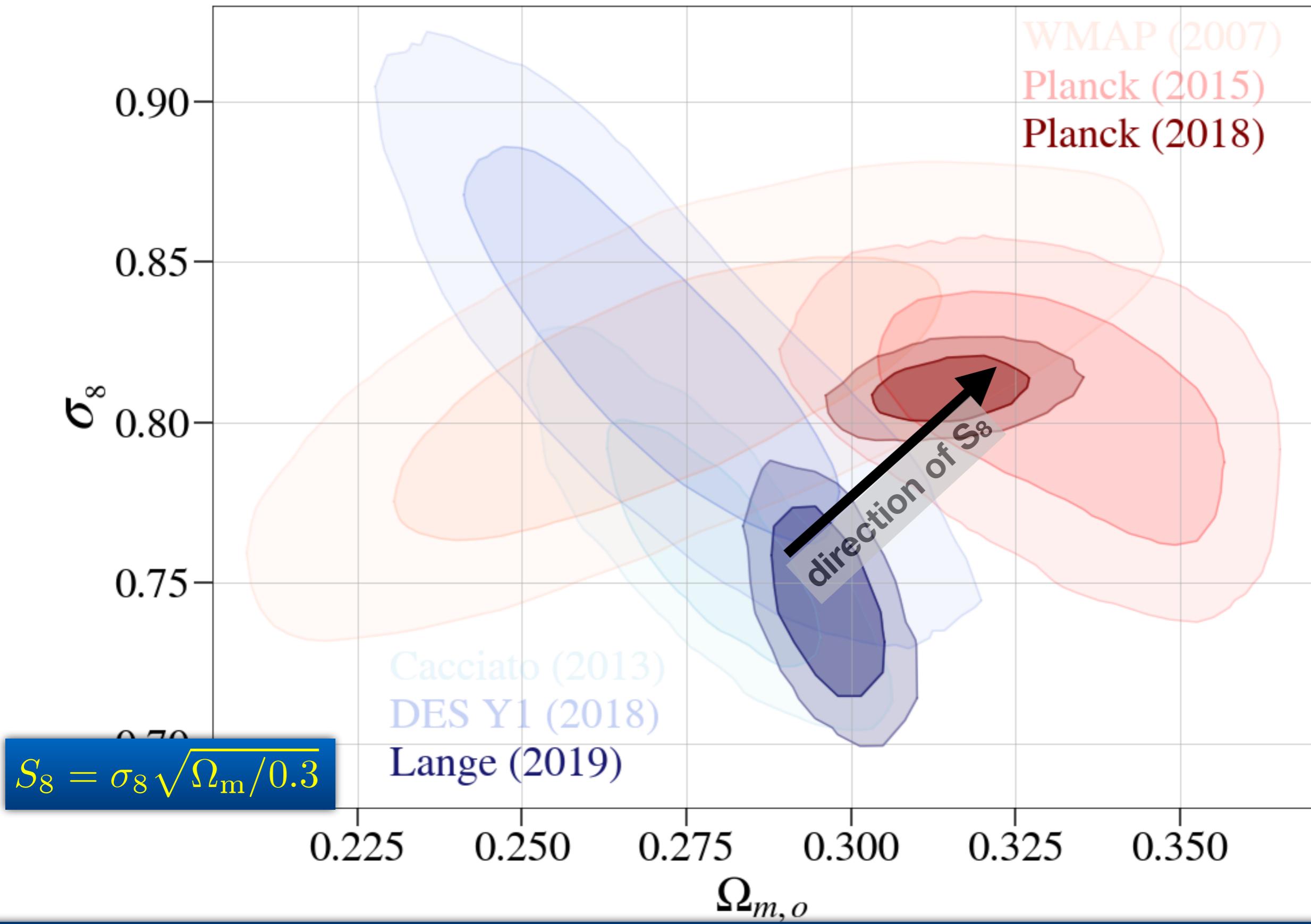
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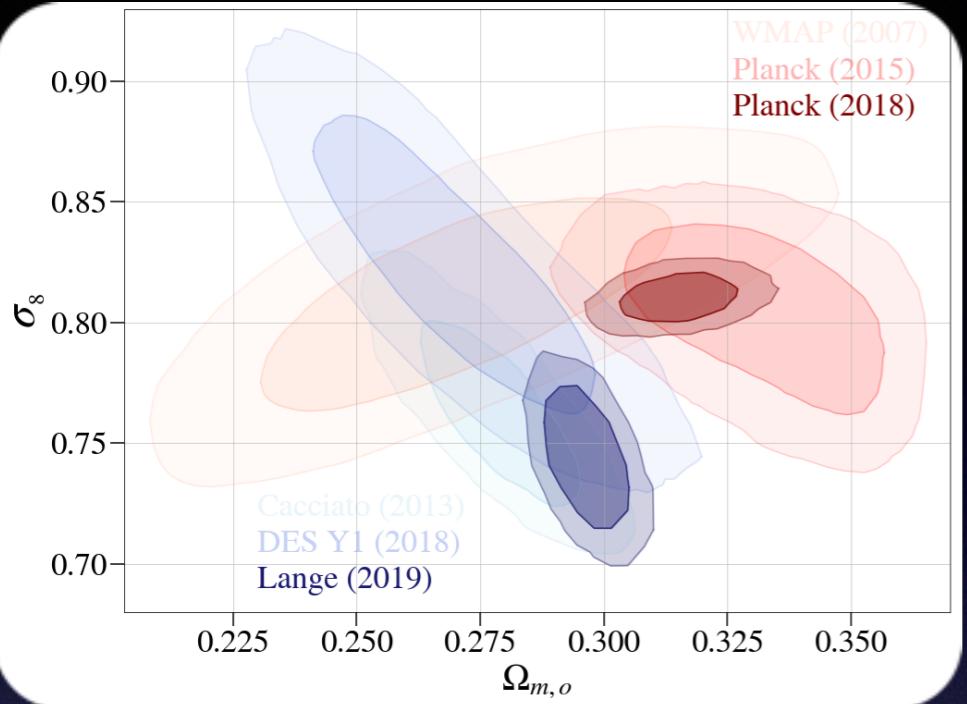
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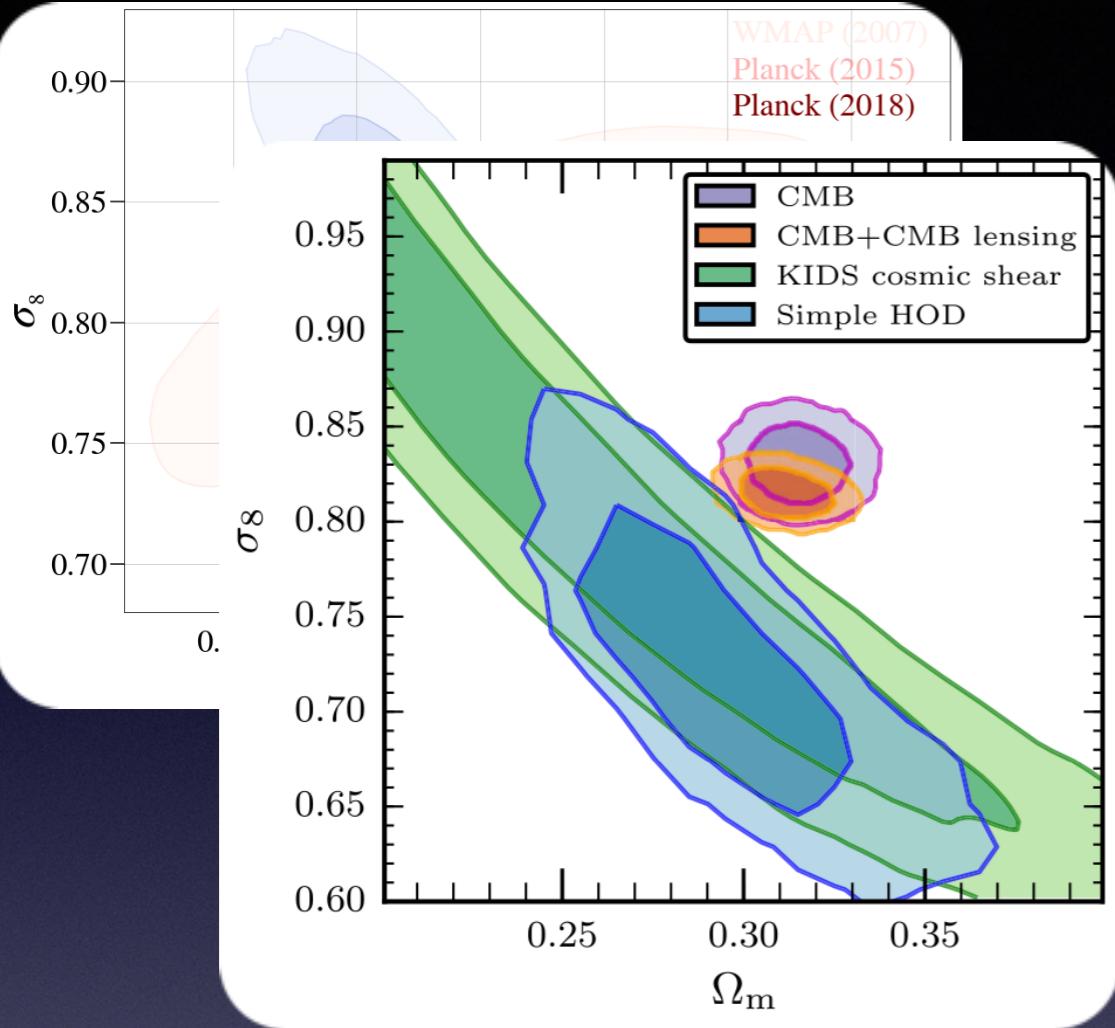
# The $S_8$ Tension



# The $S_8$ Tension = “Lensing is Low” problem

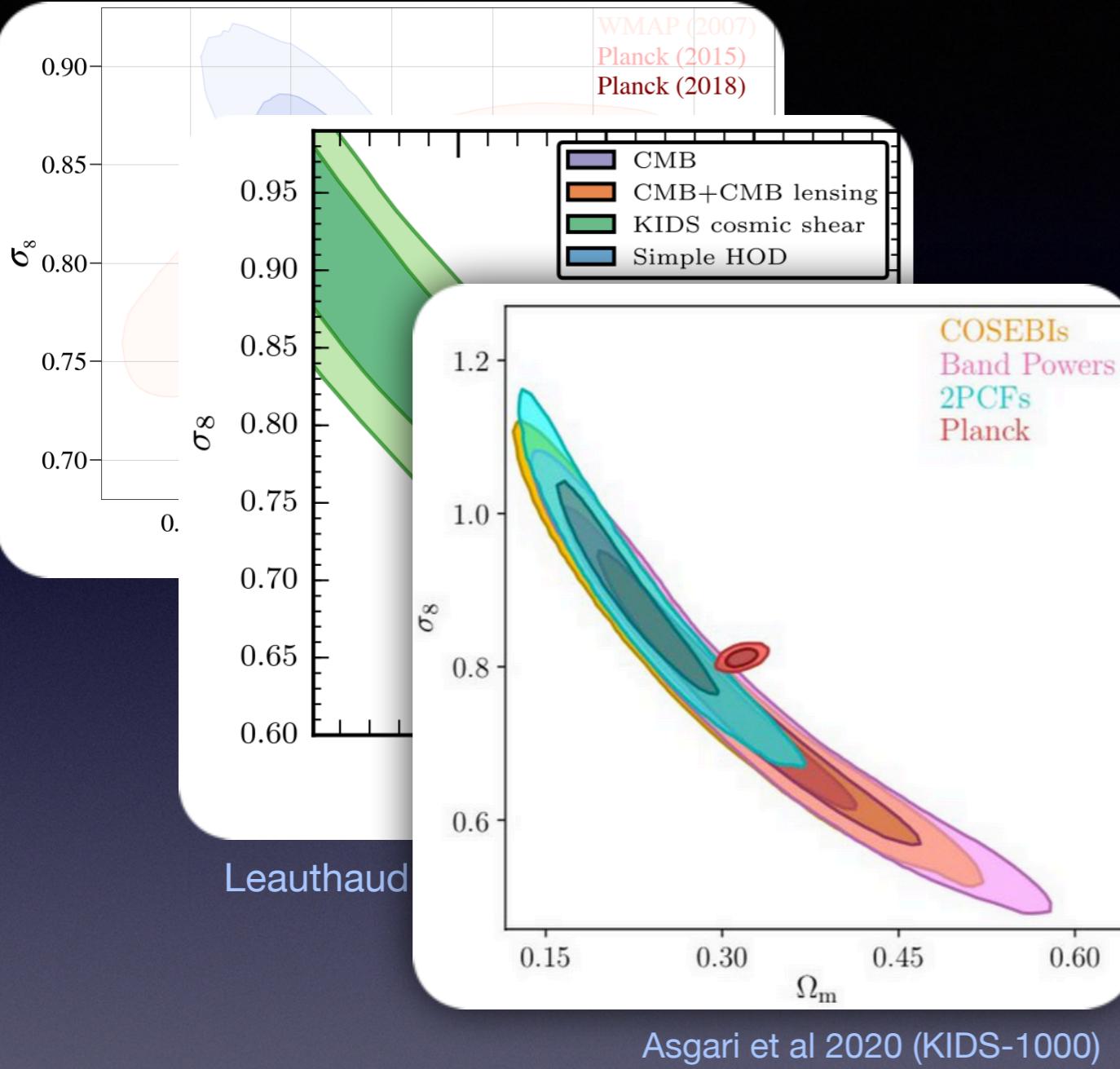


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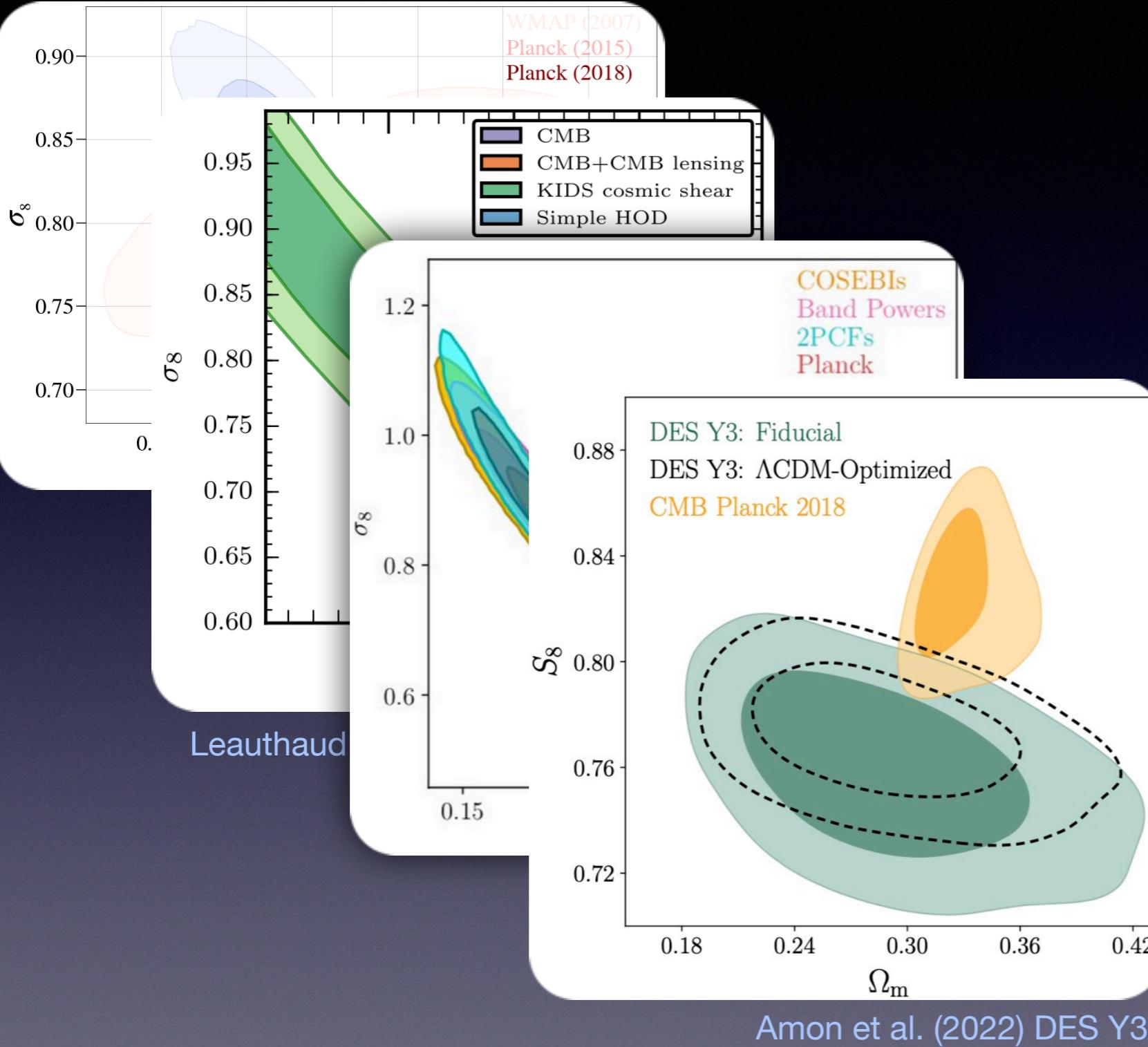


Leauthaud et al. (2017) BOSS-CMASS

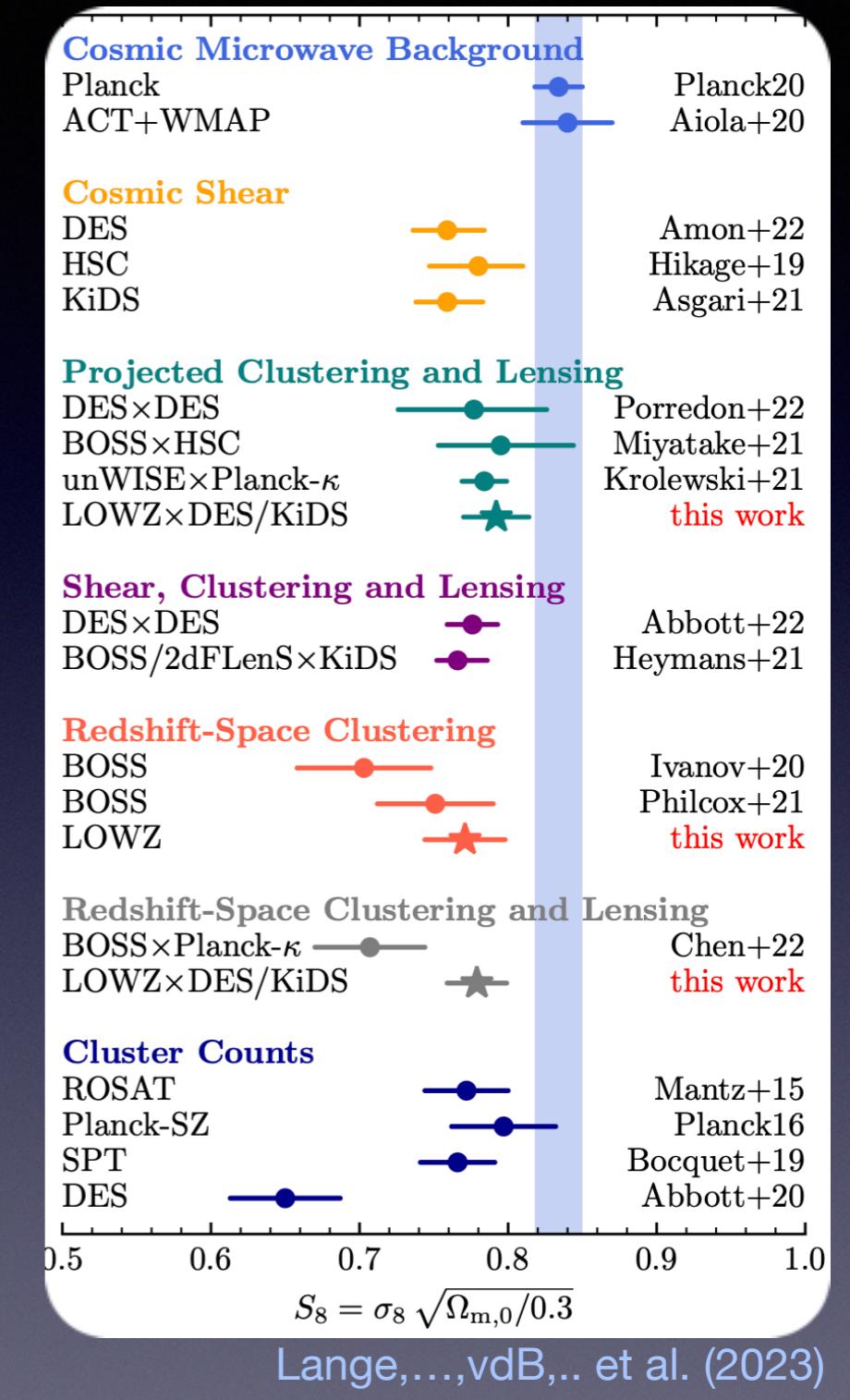
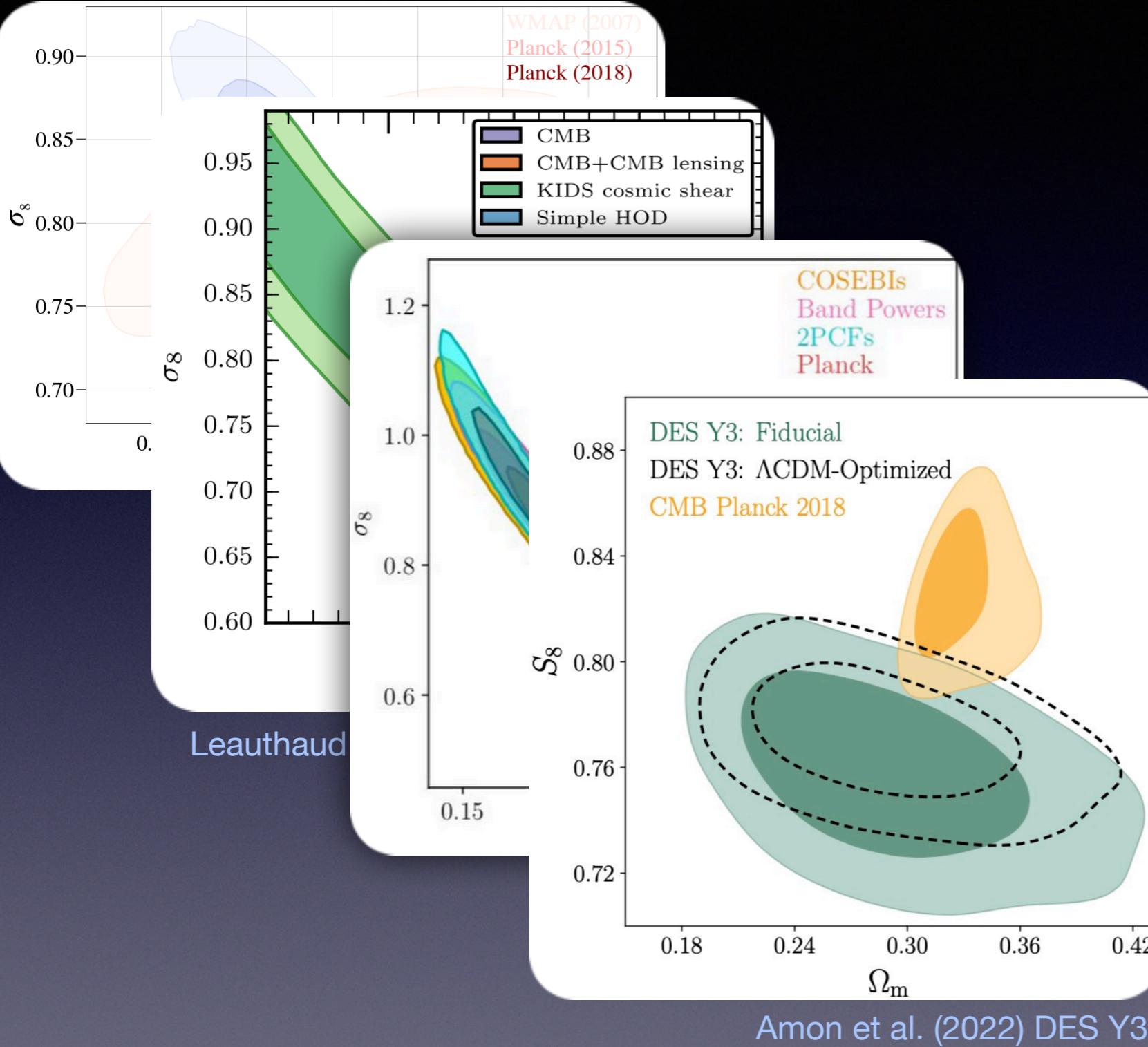
# The $S_8$ Tension = “Lensing is Low” problem



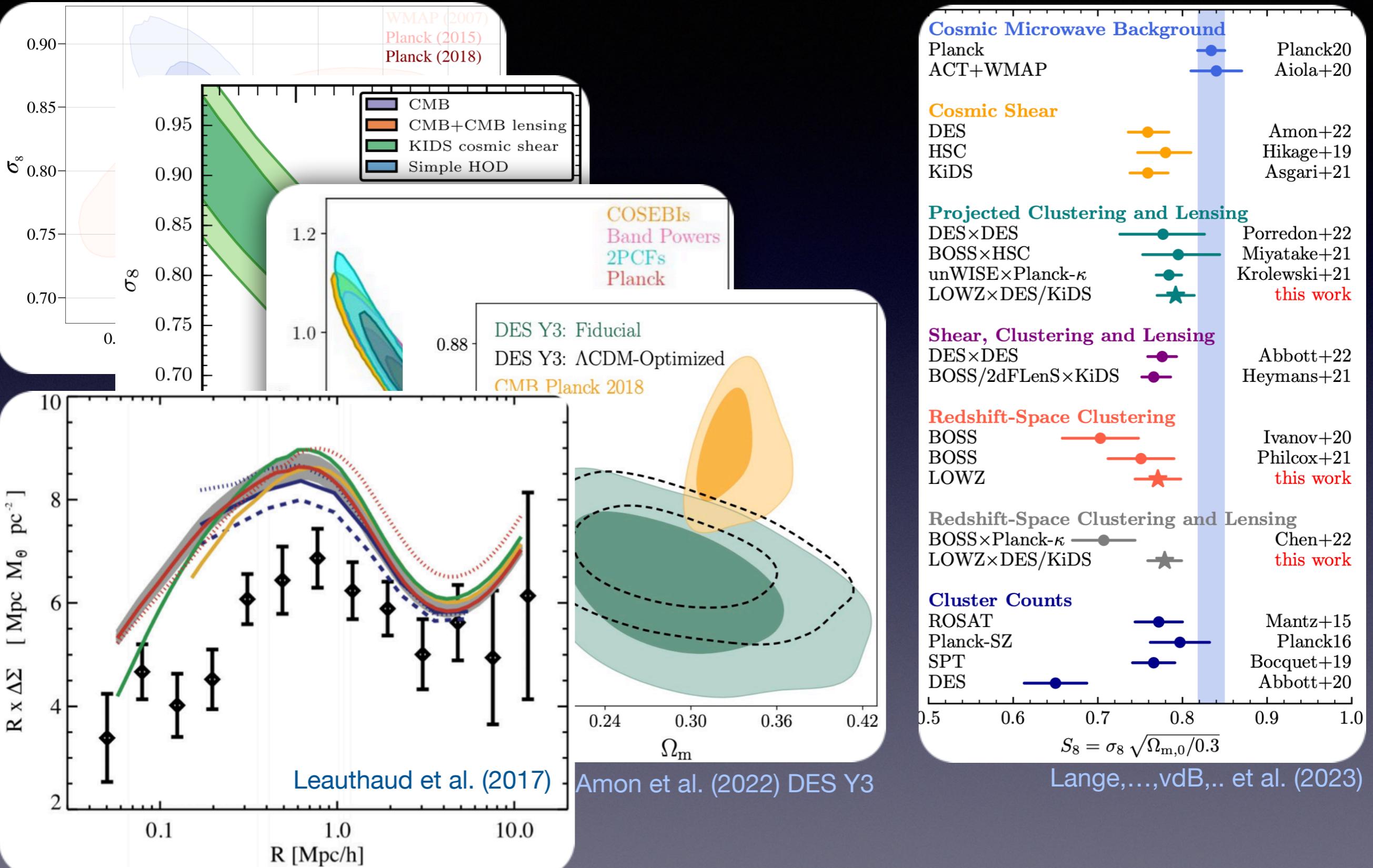
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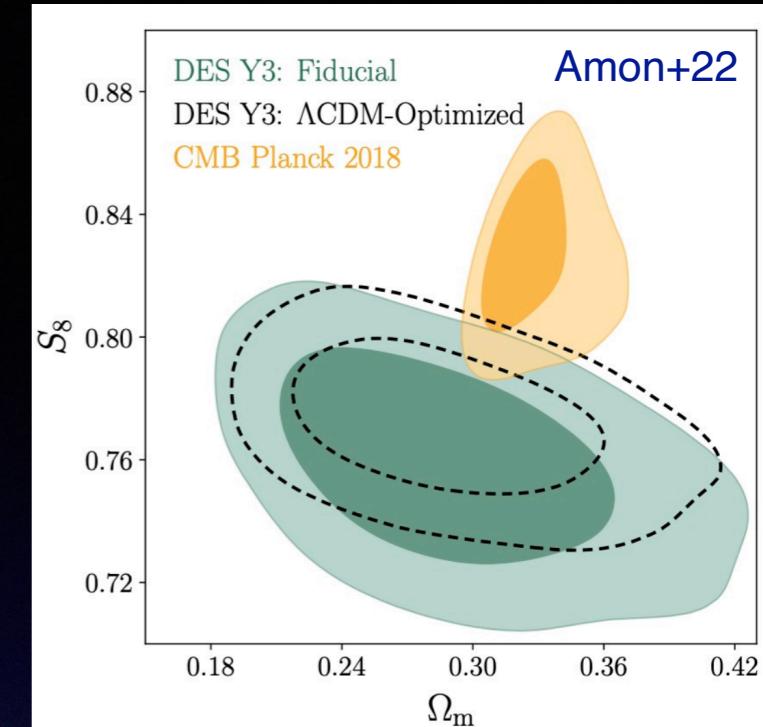
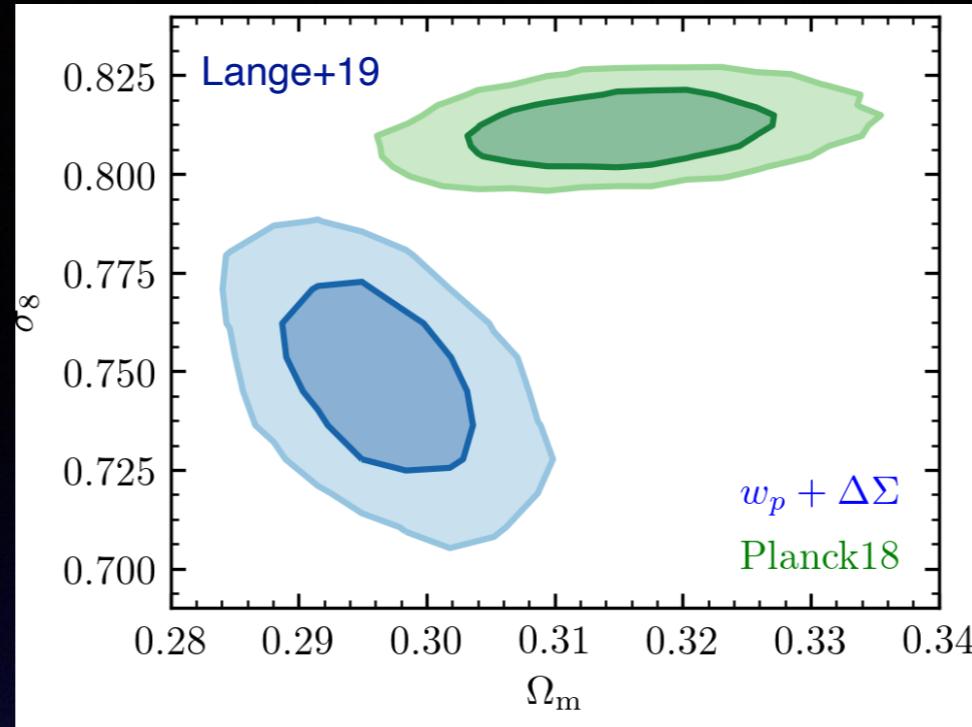
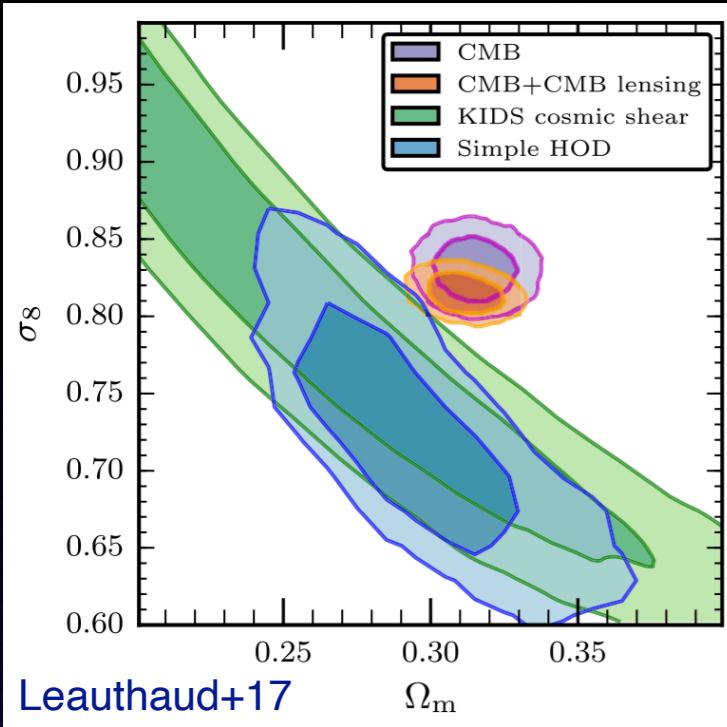


# The $S_8$ Tension = “Lensing is Low” problem



# The $S_8$ Tension = “Lensing is Low” problem





There is a persistent tension between observations of the low- $z$  Universe and Planck CMB results.

- Systematic error in Planck analysis?  
there is also tension with respect to Hubble parameter...
- New physics beyond the 6-parameter “vanilla” LCDM model?  
neutrino mass, dark matter is warm/fuzzy/self-interacting,...
- Systematic errors in lensing shear measurements?
- Systematic errors in modeling of clustering and/or lensing?  
assembly bias, impact of baryons,...



# **The Dark Side of Halo Occupation Modelling**

**WARNING:** things are about to get ugly and depressing



stop listening if you suffer from  
anxiety or heart conditions

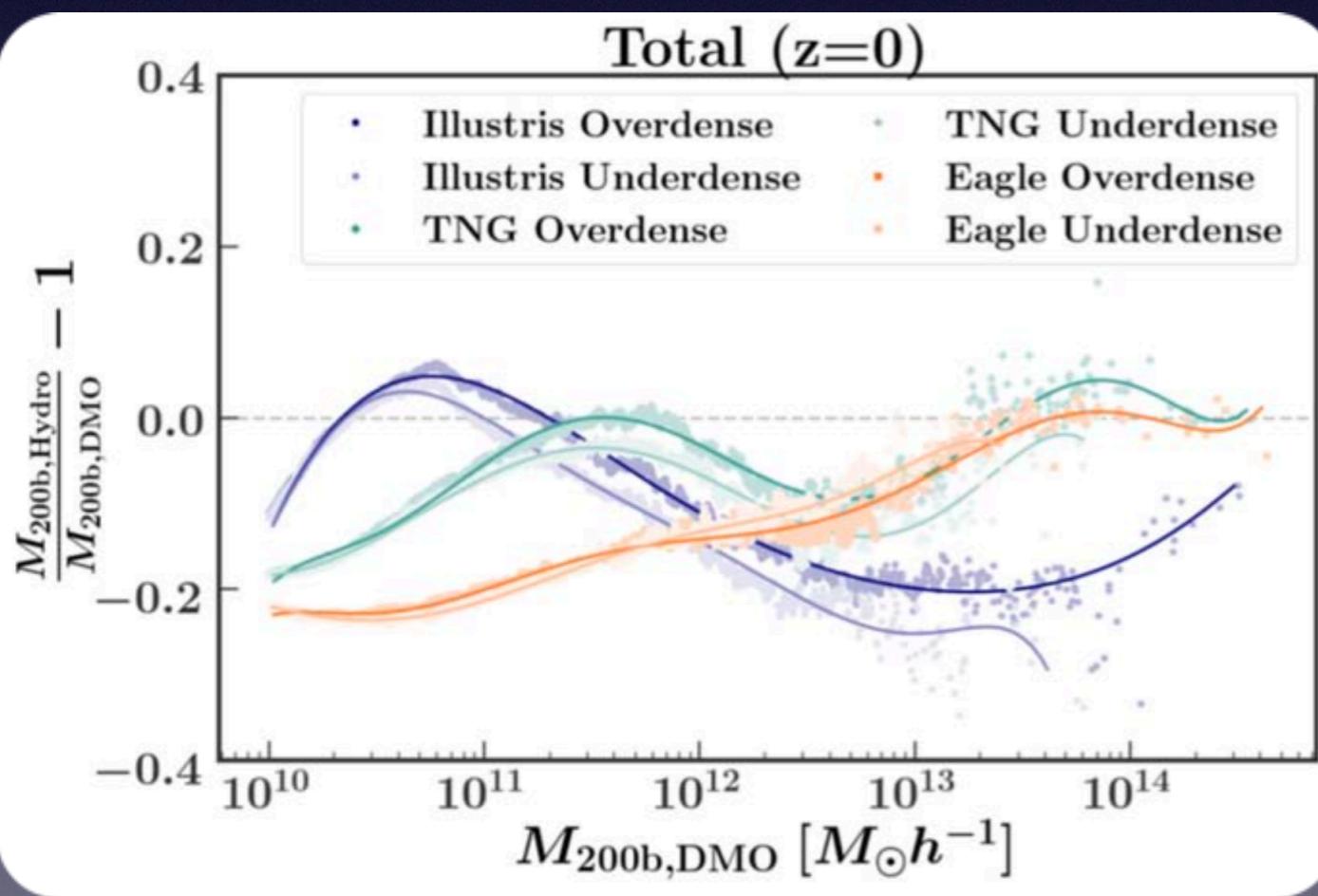
# Baryonic Effects

Throughout, it is assumed that dark matter halos follow a NFW profile.

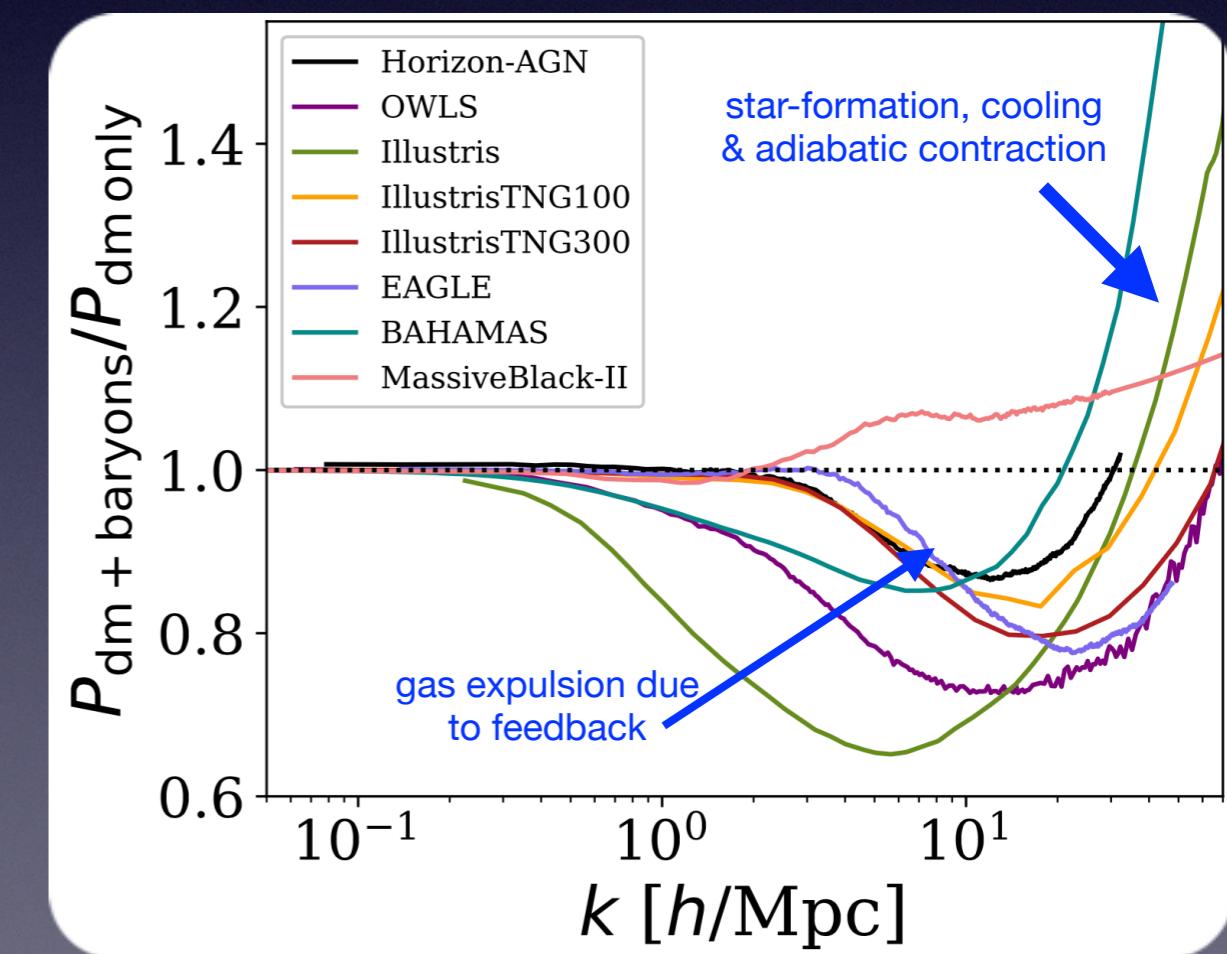
This is motivated by results from N-body, dark-matter-only (DMO) simulations.

However, hydro-dynamical simulations show that galaxy formation physics impacts both the **masses** and **density profiles** of dark matter halos...

Zentner et al. 2008; van Daalen et al. 2011, Sawala et al. 2013, Martizzi et al. 2016  
Springel et al. 2017, Schneider et al. 2019, Chisari et al. 2019, Beltz-Mohrmann & Berlind 2021



source: Beltz-Mohrmann & Berlind (2021)



source: Chisari et al. (2019)

# Baryonic Effects

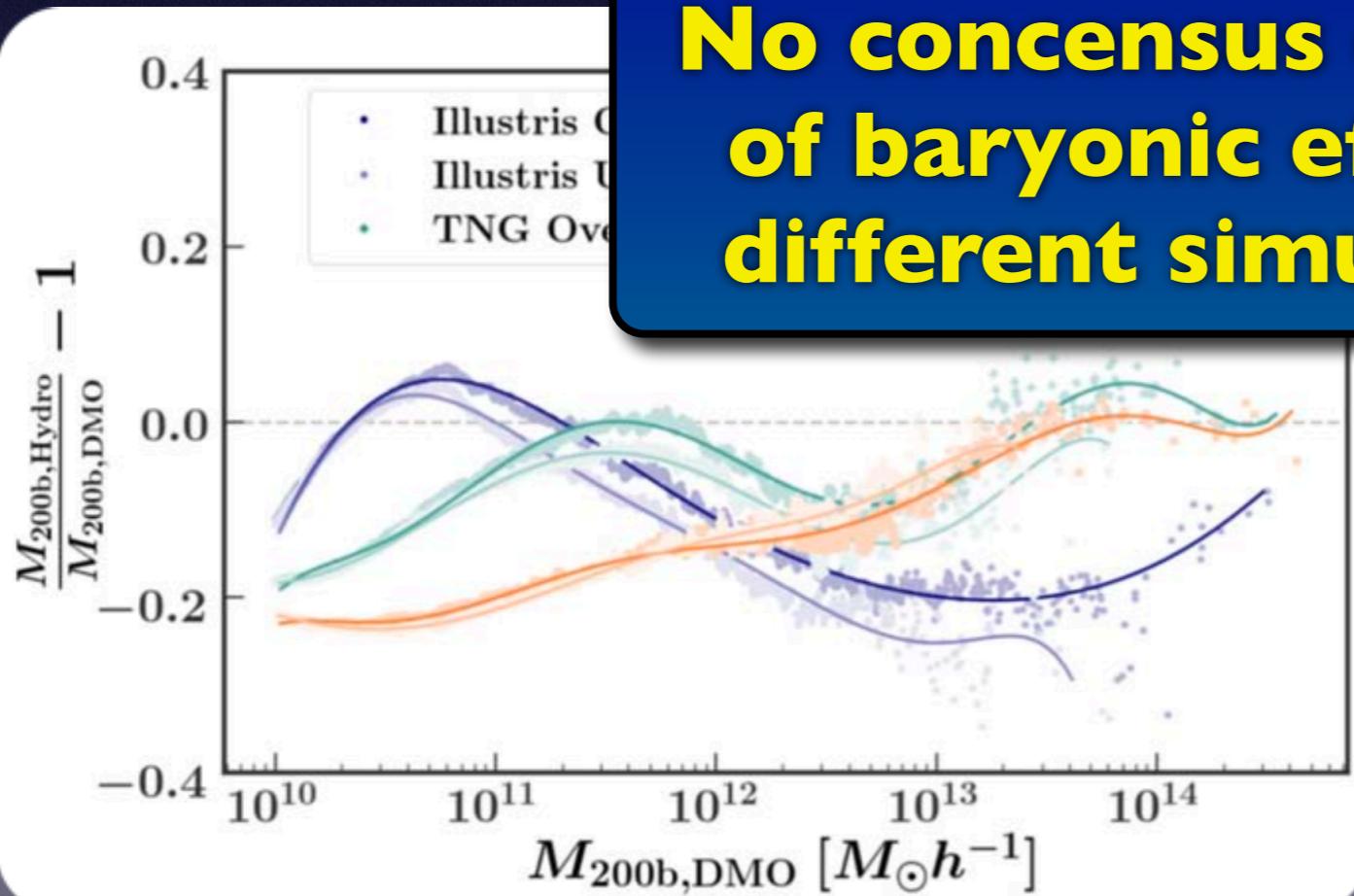
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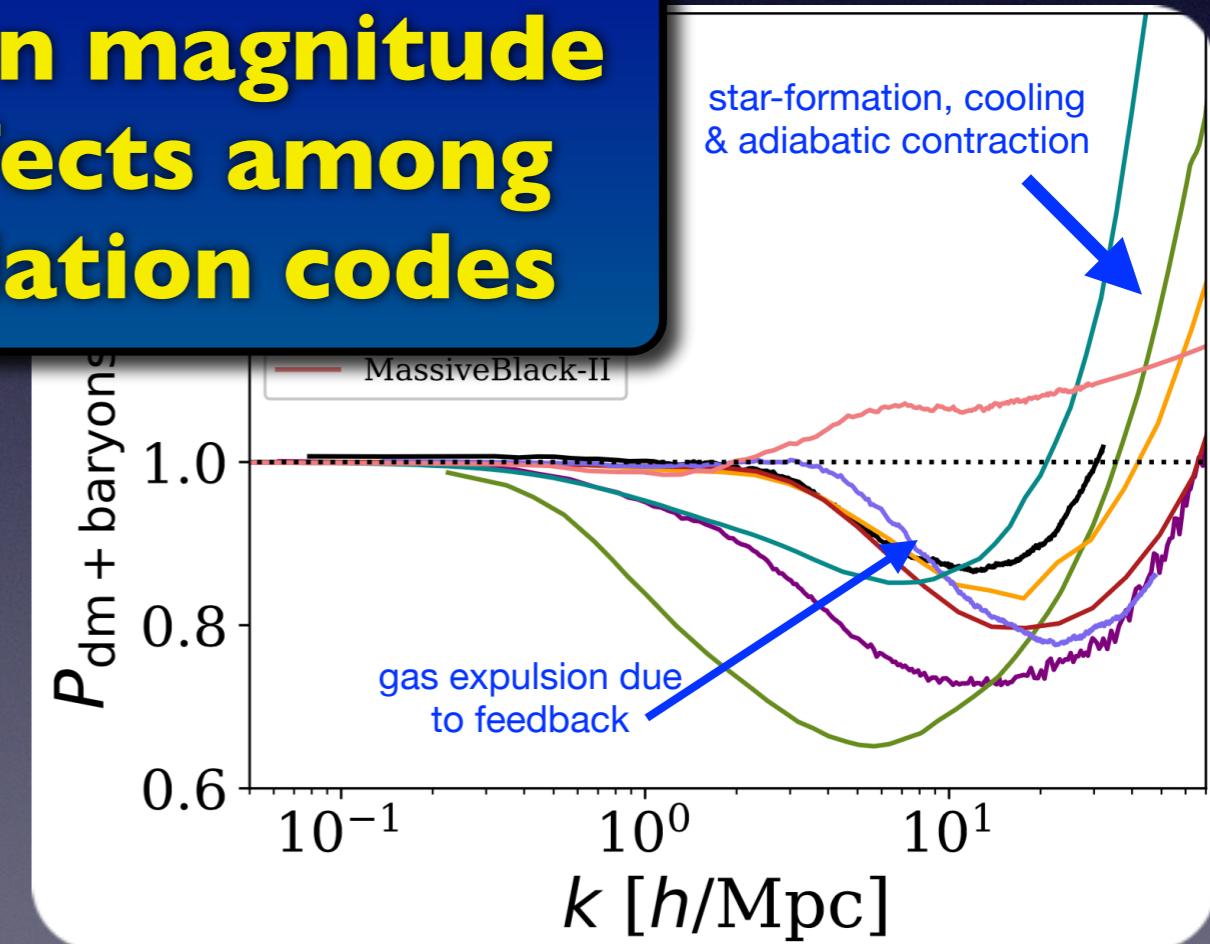
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**No concensus on magnitude of baryonic effects among different simulation codes**



source: Beltz-Mohrmann & Berlind (2021)



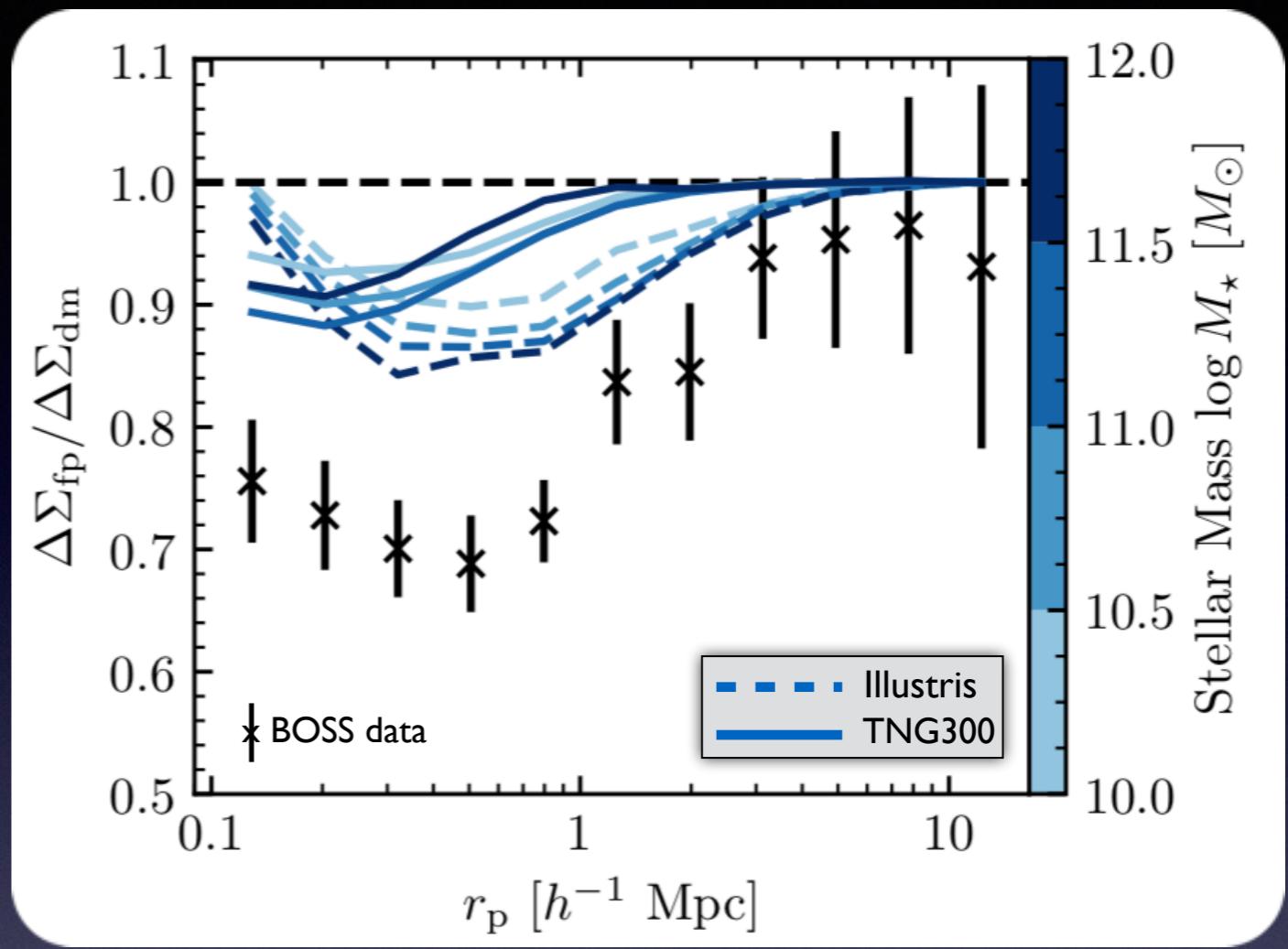
source: Chisari et al. (2019)

# Baryonic Effects vs S<sub>8</sub> Tension

‘Feedback’ reduces ESD on small scales ( $\lesssim 1$  Mpc).

Not accounted for in most clustering/lensing analyses

Effect diminishes, but seems unable to fully solve “lensing is low”

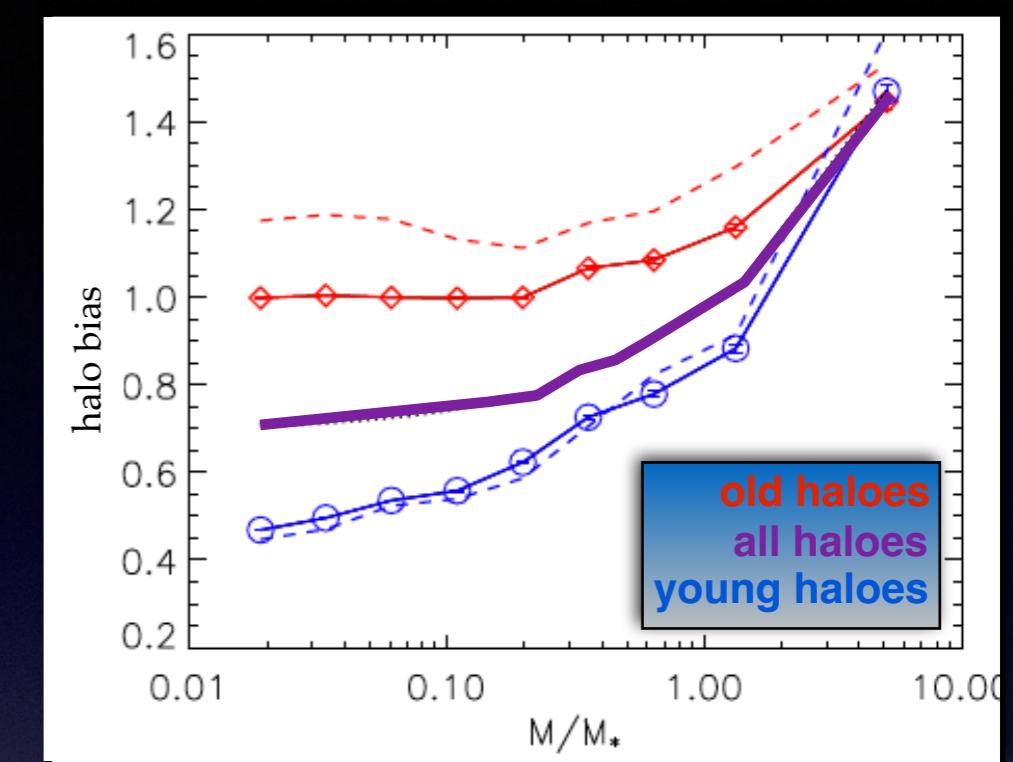
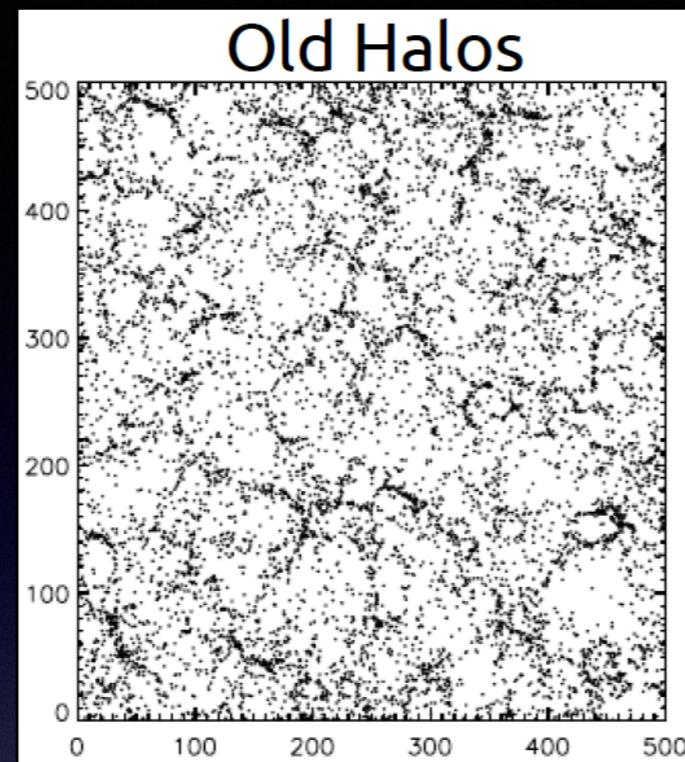
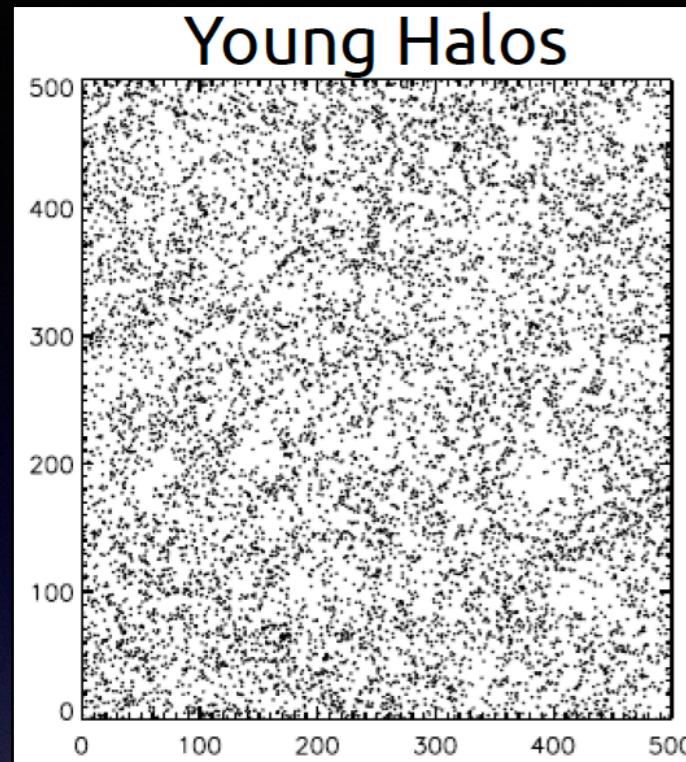


source: Lange et al. (2019)

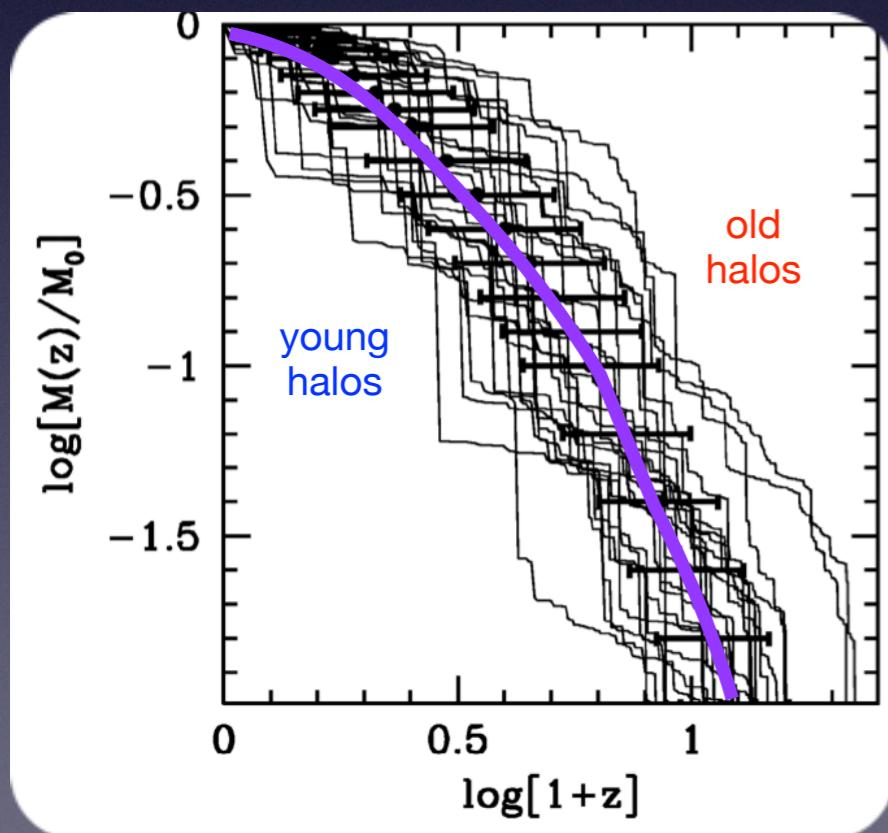
- Main Challenge:
- There is (and likely never will be) **concensus** among simulations as to the magnitude of the effect.
  - Assume simulations bracket truth and **marginalize** over uncertainties
  - Simultaneously **model & observe** stars (galaxies) and gas (CGM).



# Halo Assembly Bias



source: Gao et al. 2005



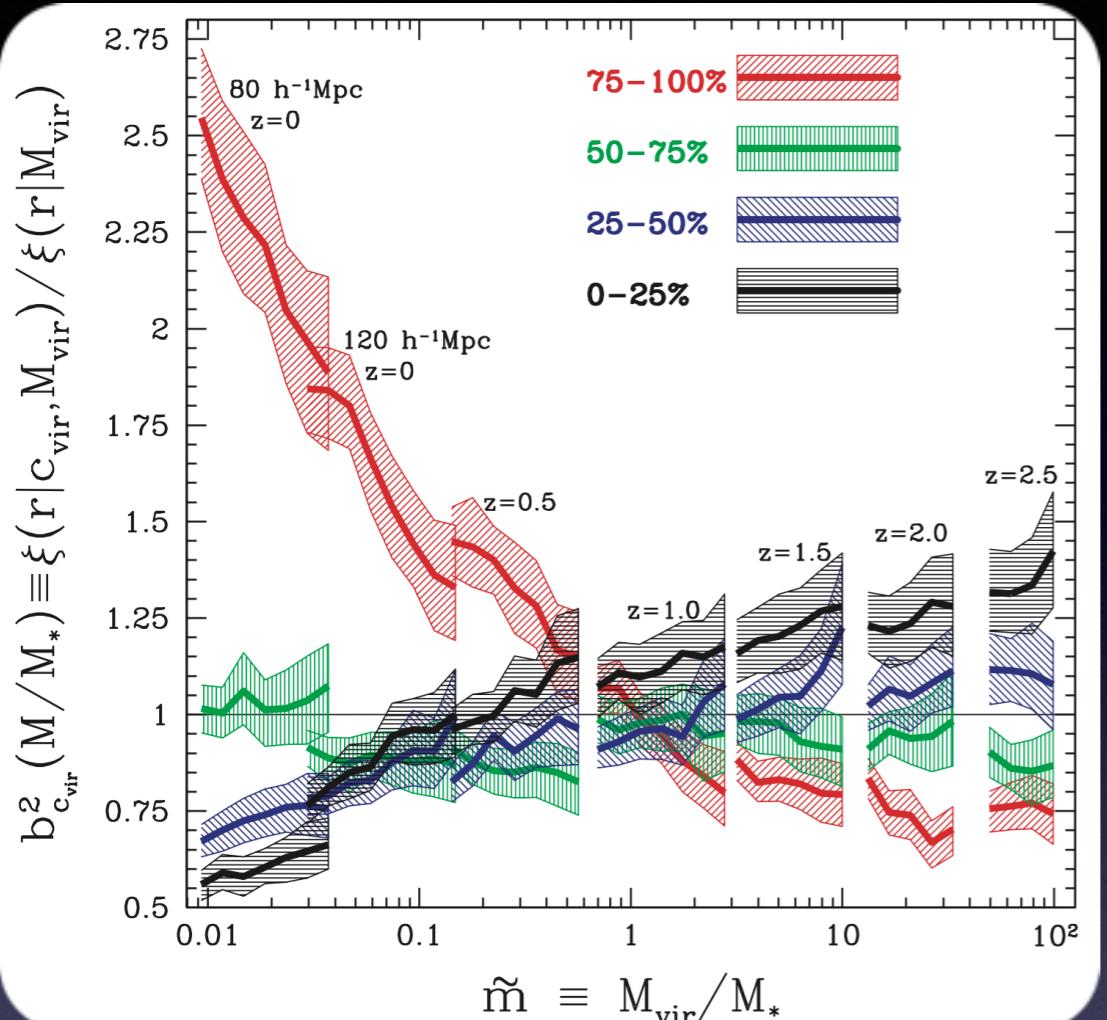
source: van den Bosch (2002)

Halo bias, at fixed mass, depends on halo age

At low masses: halos that assemble earlier are more strongly clustered

Gao et al. 2005

# Halo Assembly Bias



Halo bias also depends on halo concentration...

Wechsler et al. 2006

In fact, N-body simulations have shown that halo bias depends on virtually every halo property...

- spin parameter (angular momentum)
- environment
- halo shape

Gao & White 2007, Lacerna & Padilla 2012  
Villareal et al. 2017, Mao et al. 2018, Salcedo et al 2018

Clustering strength is not a clean indicator of halo mass



# The Origin of Halo Assembly Bias

What is the origin of Halo Assembly Bias?

Correlations between halo properties.

Halos of a given mass that assemble earlier

- are more centrally concentrated
- have smaller spin parameter
- have less (surviving) substructure
- are more spherical

Wechsler et al. 2002; Vitvitska et al. 2002

Gao et al. 2004, vdBosch 2005

Allgood et al. 2006; Jiang & vdBosch 2017

Tides from nearby halos or large-scale structure [arrested development]

Desjacques 2008; Dalal et al. 2008; Hahn et al. 2009; Wang et al. 2011

Hearin et al. 2016; Paranjape et al. 2018; Mansfield & Kravtsov 2019

Contamination with Splashback halos

[environmental stripping]

Wang et al. 2009; Li et al. 2013; Wetzel et al. 2015; Hearin et al. 2015

Sunayama et al. 2016; Tucci et al 2020; Mansfield & Kravtsov 2020

# Galaxy Assembly Bias

## Halo Assembly Bias:

the effect that the clustering of halos at fixed mass depends on secondary halo properties

aka secondary halo bias

## Mass-Only Ansatz:

the assumption, made up to now, that halo occupation statistics depend only on halo mass

## Galaxy Assembly Bias:

at fixed halo mass, the occupation statistics depend on secondary halo properties that show halo assembly bias

i.e.

$$P(L|M, x) \neq P(L|M) \quad \text{or} \quad \langle N|M, x \rangle \neq \langle N|M \rangle \quad \text{when} \quad b(M, x) \neq b(M)$$

GAB

GAB

HAB

Galaxy Assembly Bias is a violation of the Mass-Only ansatz

# Galaxy Assembly Bias

## Why do we care about galaxy assembly bias?

- provides important insight into galaxy formation
- ignoring GAB can bias the inferred galaxy-halo connection

Empirical Fact:

red galaxies are more strongly clustered than blue galaxies of same stellar mass.

without GAB:

red galaxies reside in more massive halos than their blue counterparts

with GAB:

red galaxies reside in older halos than their blue counterparts, but of same mass

See Zentner, Hearn & vdB (2014) for an explicit example

- ignoring GAB can bias cosmological inference



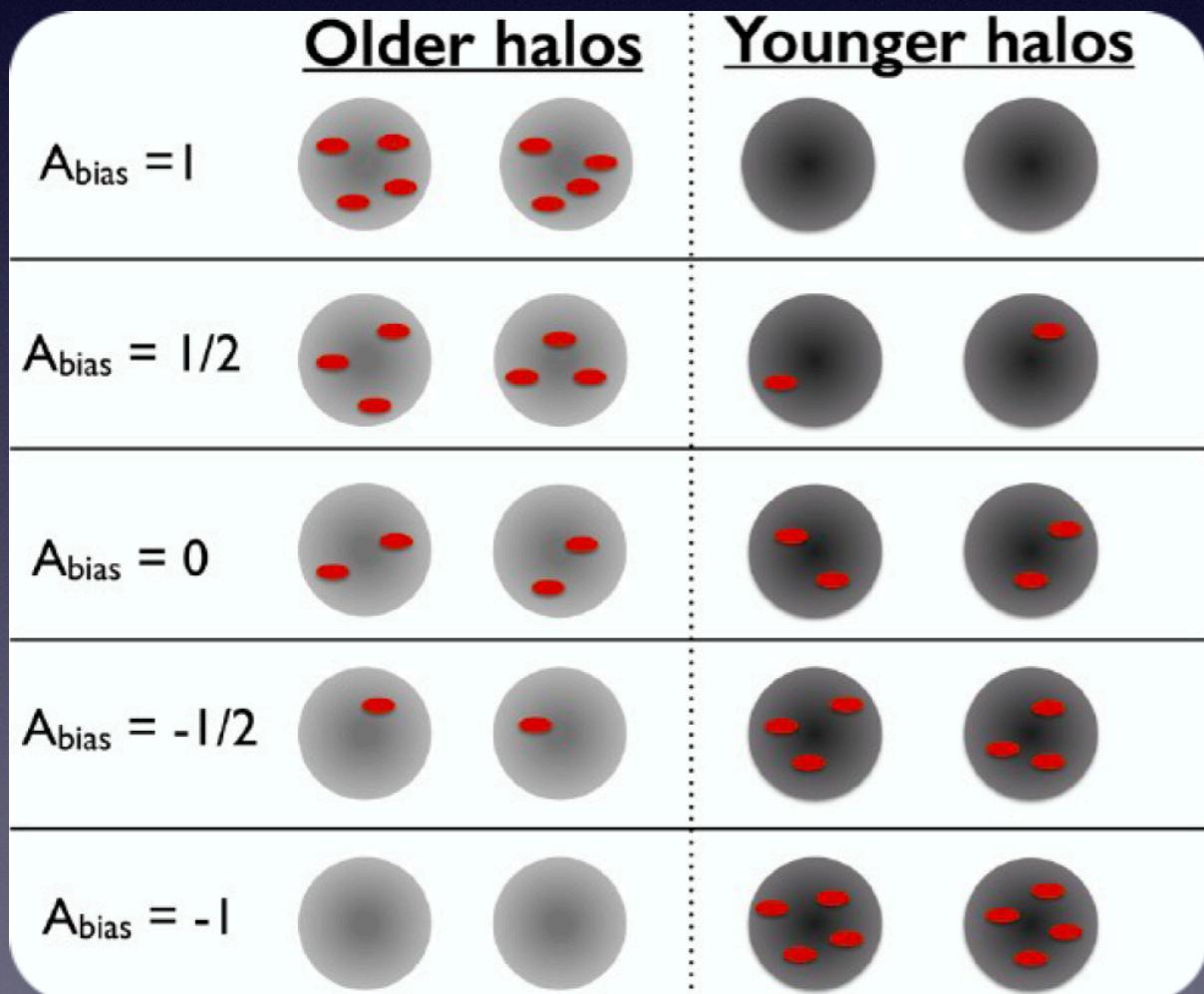
might the  $S_8$  tension be a manifestation of galaxy assembly bias

# Modeling Galaxy Assembly Bias

## How can one model galaxy assembly bias?

- generalize halo occupation models:  $P(L|M) \rightarrow P(L|M,x)$   
 $\langle N|M \rangle \rightarrow \langle N|M,x \rangle$
- quantify relevant halo bias  $b(M) \rightarrow b(M,x)$

**Bottleneck:** we (currently) lack an analytical/theoretical model for  $b(M,x)$



source: Hearn et al. 2016

**Virtually all models that include assembly bias are simulation-based**

decorated-HOD (dHOD)

Hearn, Zentner, vdB et al. 2016

$$\langle N|M,x_{\text{high}} \rangle = \langle N|M \rangle + \delta N$$

$$\langle N|M,x_{\text{low}} \rangle = \langle N|M \rangle - \delta N$$

GRAND-HOD

Yuan et al. 2018

inject  $x$ -dependence into HOD parameters

Walsh & Tinker 2019; Xu et al. 2020

flexible Abundance Matching

Lehmann et al. 2017; Contreras et al. 2021, 2023

Conditional Abundance Matching (CAM)

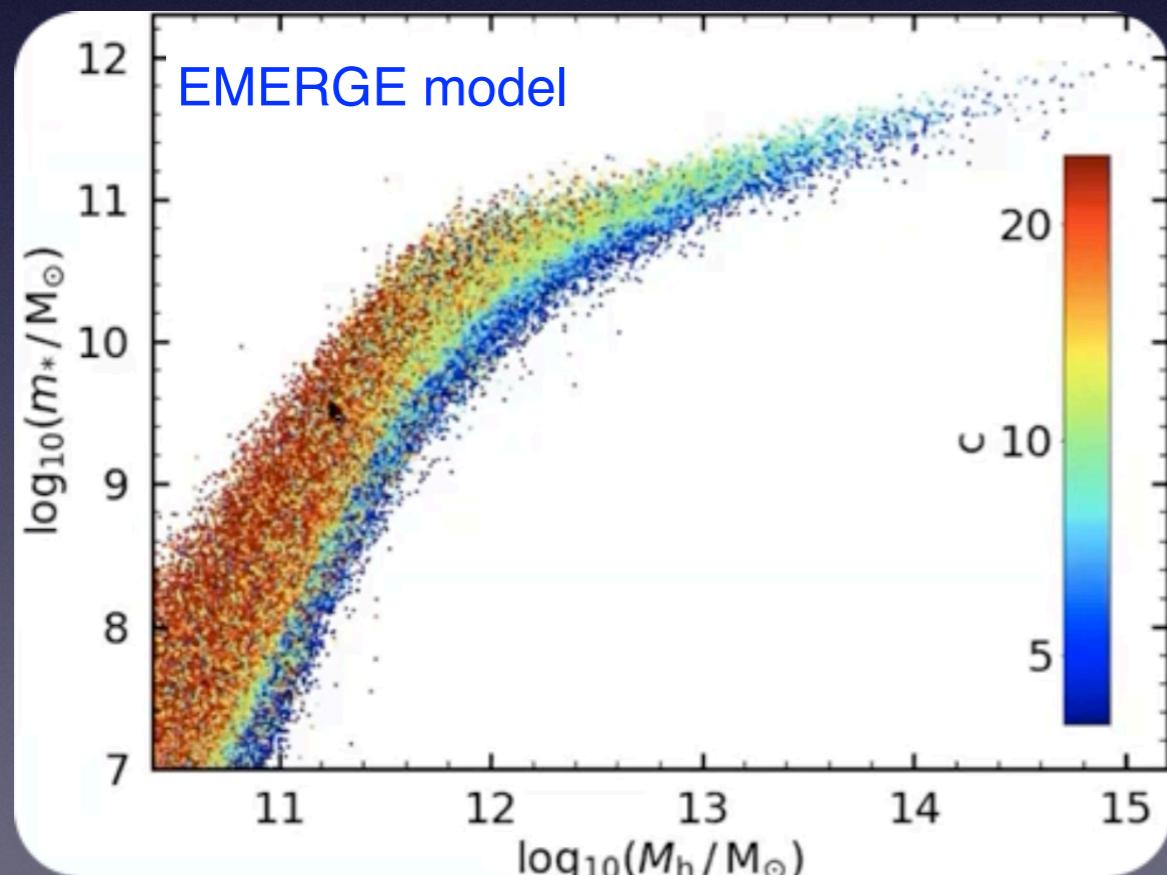
Hearn & Watson 2013

# Galaxy Assembly Bias

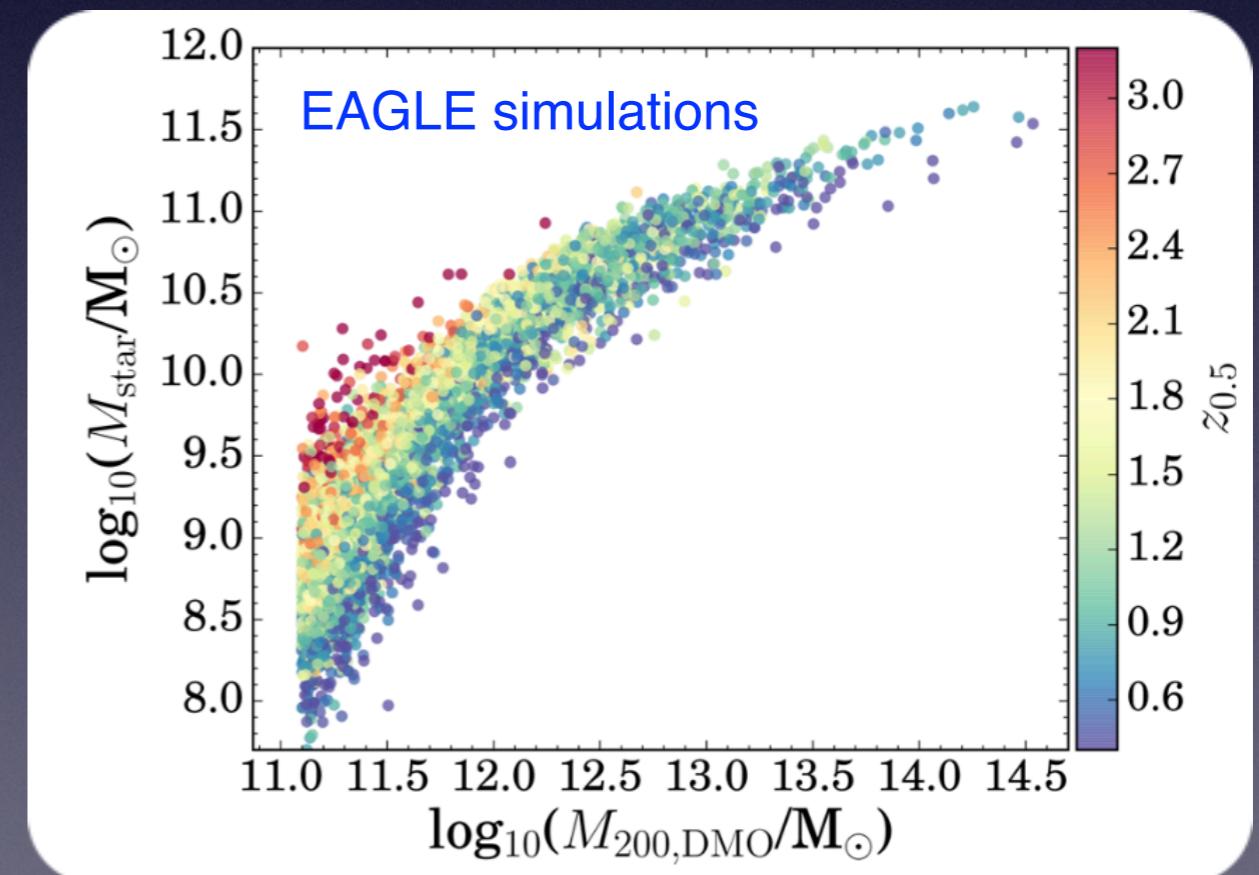
## Do we expect galaxy assembly bias?

- there is NO reason to assume that there is NO galaxy assembly bias
- it seems only logical that the properties of a galaxy depend on the assembly history, spin, and shape of its dark matter halo
- SAMs, SIMs and empirical models all ‘predict’ different levels of GAB

Artale et al. 2018; Zehavi et al. 2018; Bose et al. 2019; Contreras et al. 2019; Xu & Zheng 2020



source: Moster et al. 2018

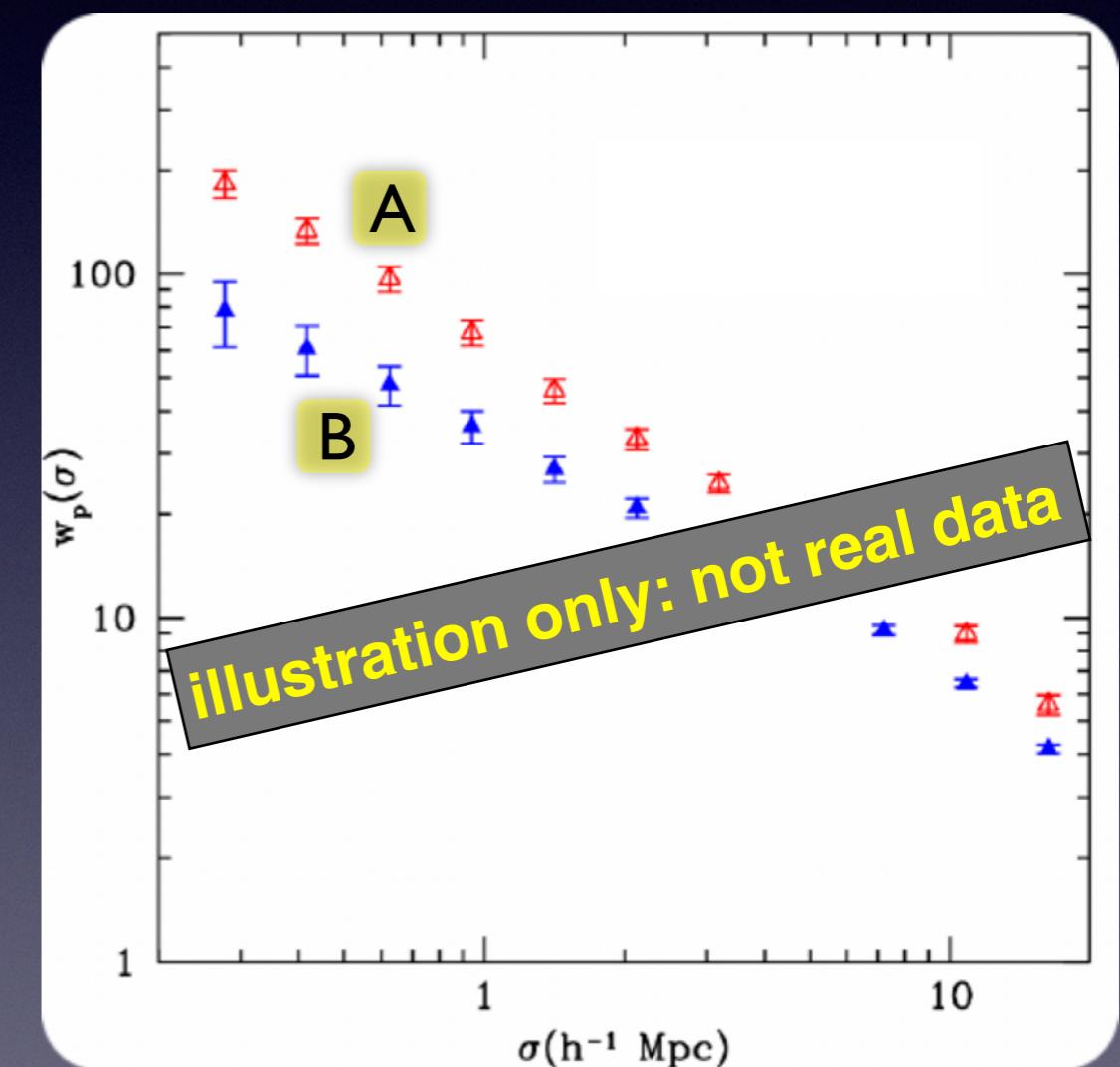
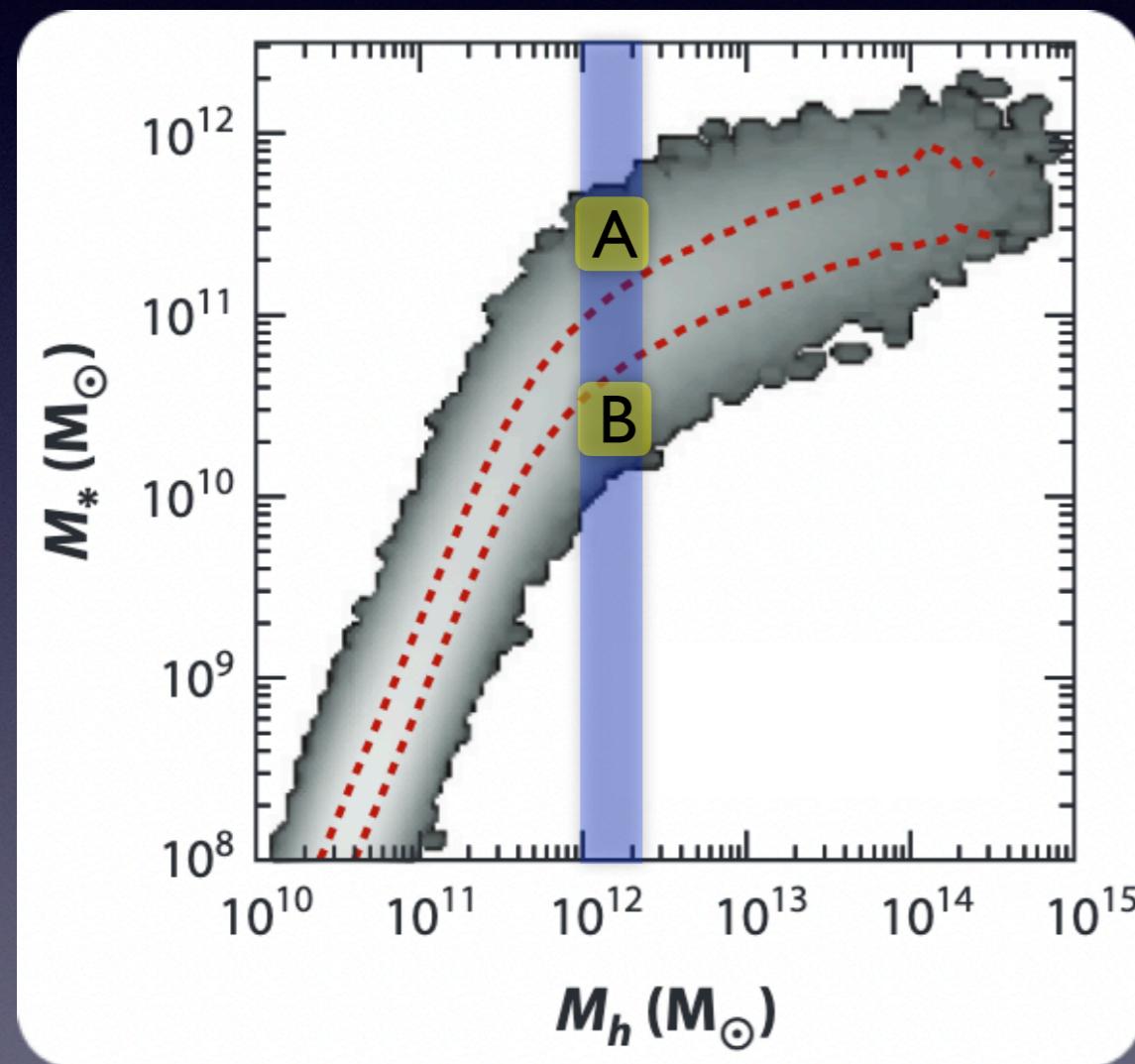


source: Matthee et al. 2017

# Galaxy Assembly Bias

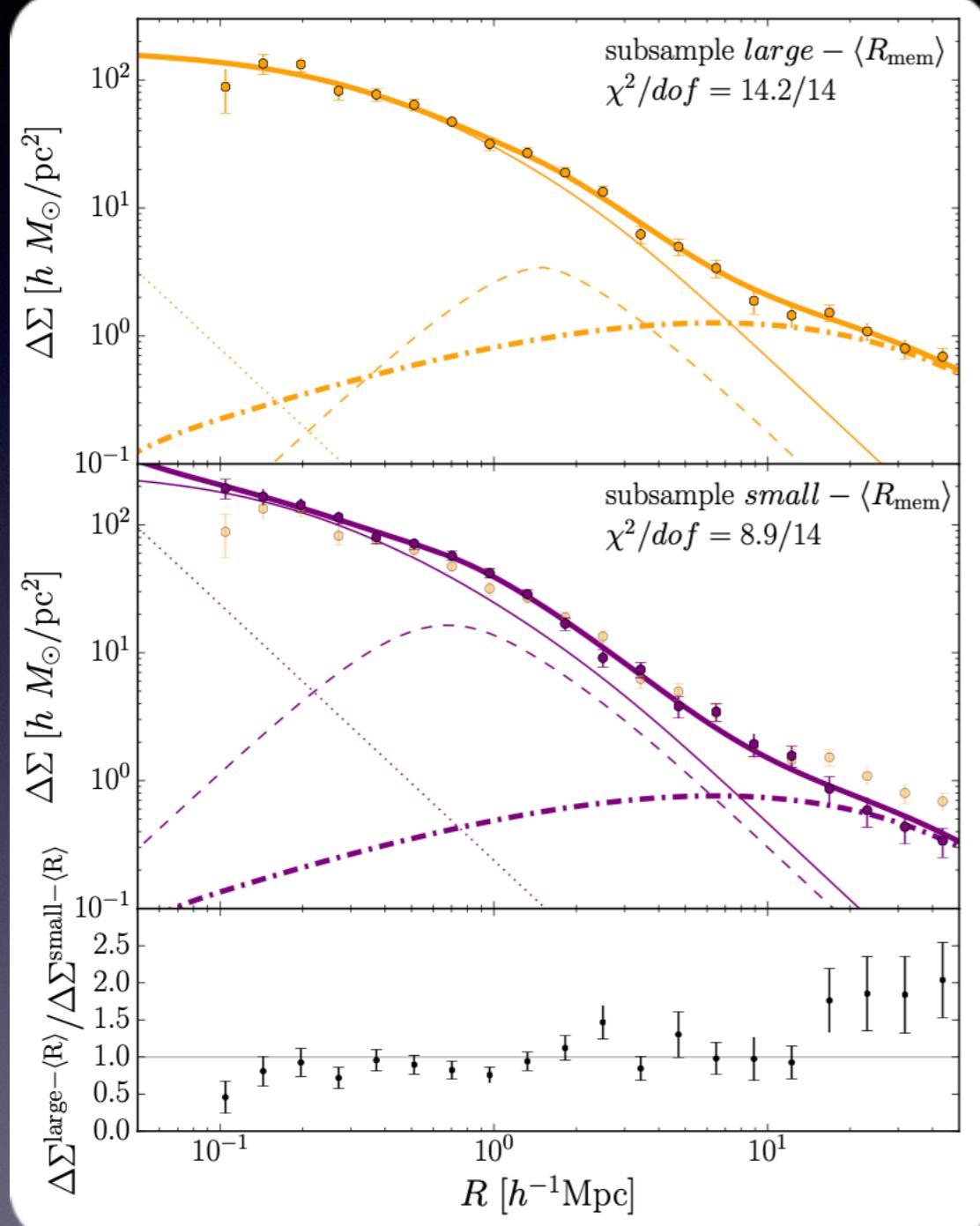
Have we observationally detected galaxy assembly bias?

- direct detection: requires demonstration that different subsets of the same halo mass are clustered differently

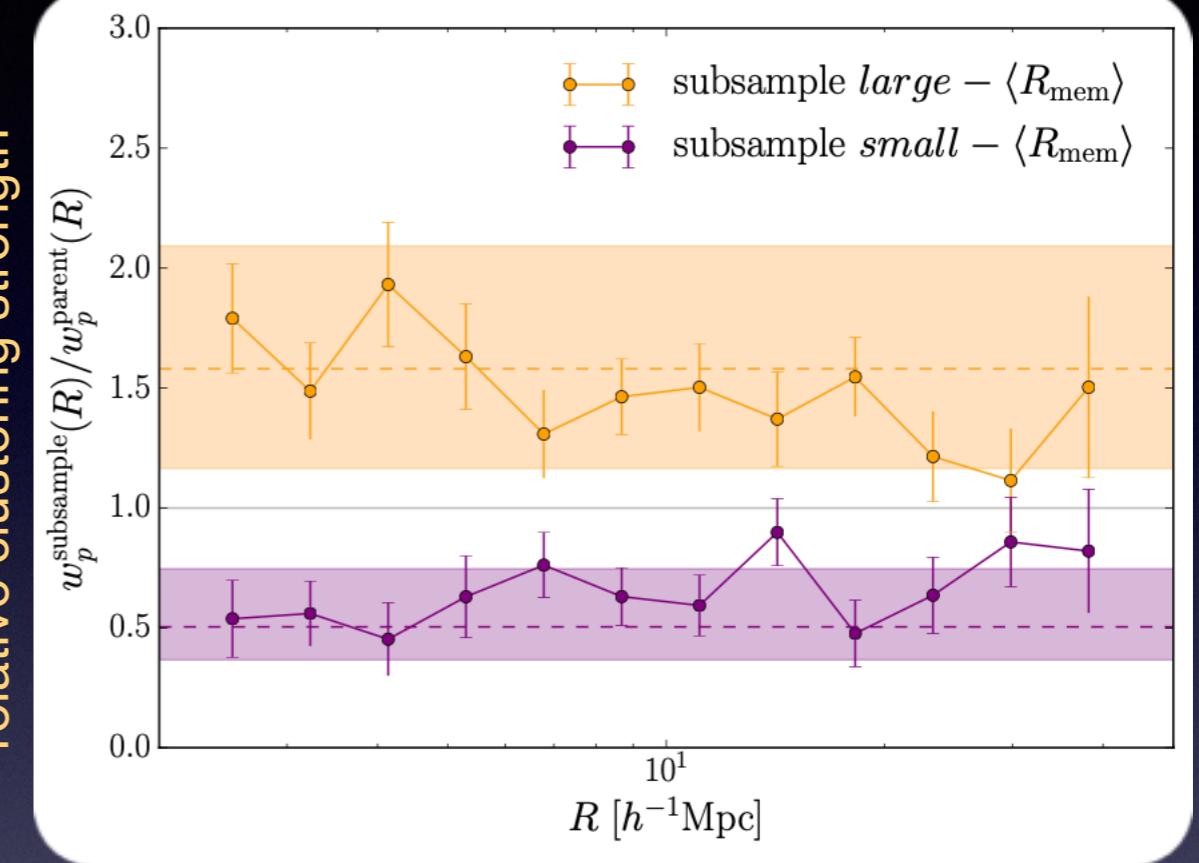


# Galaxy Assembly Bias

Have we observationally detected galaxy assembly bias?



source: Miyatake et al. 2016



Miyatake et al. 2016  
two cluster samples with equal g-g lensing  
(=equal mass) display different clustering.  
  
signal larger than expected  
  
effect can be explained with projection effects  
Busch et al. 2017; Zu et al. 2017; Sunayama et al. 2020

# Galaxy Assembly Bias

## Have we observationally detected galaxy assembly bias?

Monthly Notices  
of the  
ROYAL ASTRONOMICAL SOCIETY  
MNRAS 452, 1958–1969 (2015)



doi:10.1093/mnras/stv1358

**Beyond halo mass: galactic conformity as a smoking gun of central galaxy assembly bias**

Andrew P. Hearin,<sup>1,2,3★</sup> Douglas F. Watson<sup>2†</sup> and Frank C. van den Bosch<sup>4</sup>

<sup>1</sup>Fermilab Center for Particle Astrophysics, Fermi National Accelerator Laboratory, Batavia, IL 60510, USA

<sup>2</sup>Kavli Institute for Cosmological Physics, 5640 South Ellis Avenue, The University of Chicago, Chicago, IL 60637, USA

<sup>3</sup>Yale Center for Astronomy and Astrophysics, Yale University, New Haven, CT 06520-8120, USA

<sup>4</sup>Department of Astronomy, Yale University, PO Box 208101, New Haven, CT 06520-8101, USA

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### ABSTRACT

Quenched central galaxies tend to reside in a preferentially quenched large-scale environment, a phenomenon that has been dubbed *galactic conformity*. Remarkably, this tendency persists out to scales far larger than the virial radius of the halo hosting the central. Therefore, conformity manifestly violates the widely adopted assumption that the dark matter halo mass  $M_{\text{vir}}$  exclusively governs galaxy occupation statistics. This paper is the first in a series studying the implications of the observed conformity signal for the galaxy–dark matter connection. We show that recent measurements of conformity on scales  $r \sim 1\text{--}5$  Mpc imply that central galaxy quenching statistics cannot be correctly predicted with the knowledge of  $M_{\text{vir}}$  alone. We also demonstrate that ejected (or ‘backsplash’) satellites cannot give rise to the signal. We then invoke the age matching model, which is predicated on the co-evolution of galaxies and haloes. We find that this model produces a strong signal, and that central galaxies are solely responsible. We conclude that large-scale ‘two-halo’ conformity represents a smoking gun of *central galaxy assembly bias*, and indicates that contemporary models of satellite quenching have systematically overestimated the influence of post-infall processes.

**Key words:** galaxies: evolution – galaxies: haloes – cosmology: theory – dark matter – large-scale structure of Universe.

### Galactic Conformity:

red/quenched galaxies are typically surrounded by red/quenched galaxies

Weinmann, vdB et al. 2006; Kauffmann et al 2013  
Kawinwanichakij et al. 2016; Berti et al. 2017

on small scales: 1-halo conformity  
on large scales: 2-halo conformity

Hearin et al. 2015

Group finder errors and projection effects can masquerade as conformity

Campbell, vdB et al. 2015; Paranjape et al. 2015  
Calderon et al. 2018; Zu & Mandelbaum 2017

Ongoing debate.....  
Challenge is to control for halo mass.

# Galaxy Assembly Bias

## Have we observationally detected galaxy assembly bias?

- direct detection: requires demonstration that different subsets of the same halo mass are clustered differently
- indirect detection: include GAB in occupation models and see if it improves fits to data. This typically requires multiple types of data (i.e., clustering + lensing) to break degeneracies.

Hearin & Watson 2013; Hearin+14; Lehmann+17; Zentner+19; Lange +19  
Vakili & Hahn 2019; Salcedo+19; Yuan+21; Wang+22; Beltz-Mohrmann+23

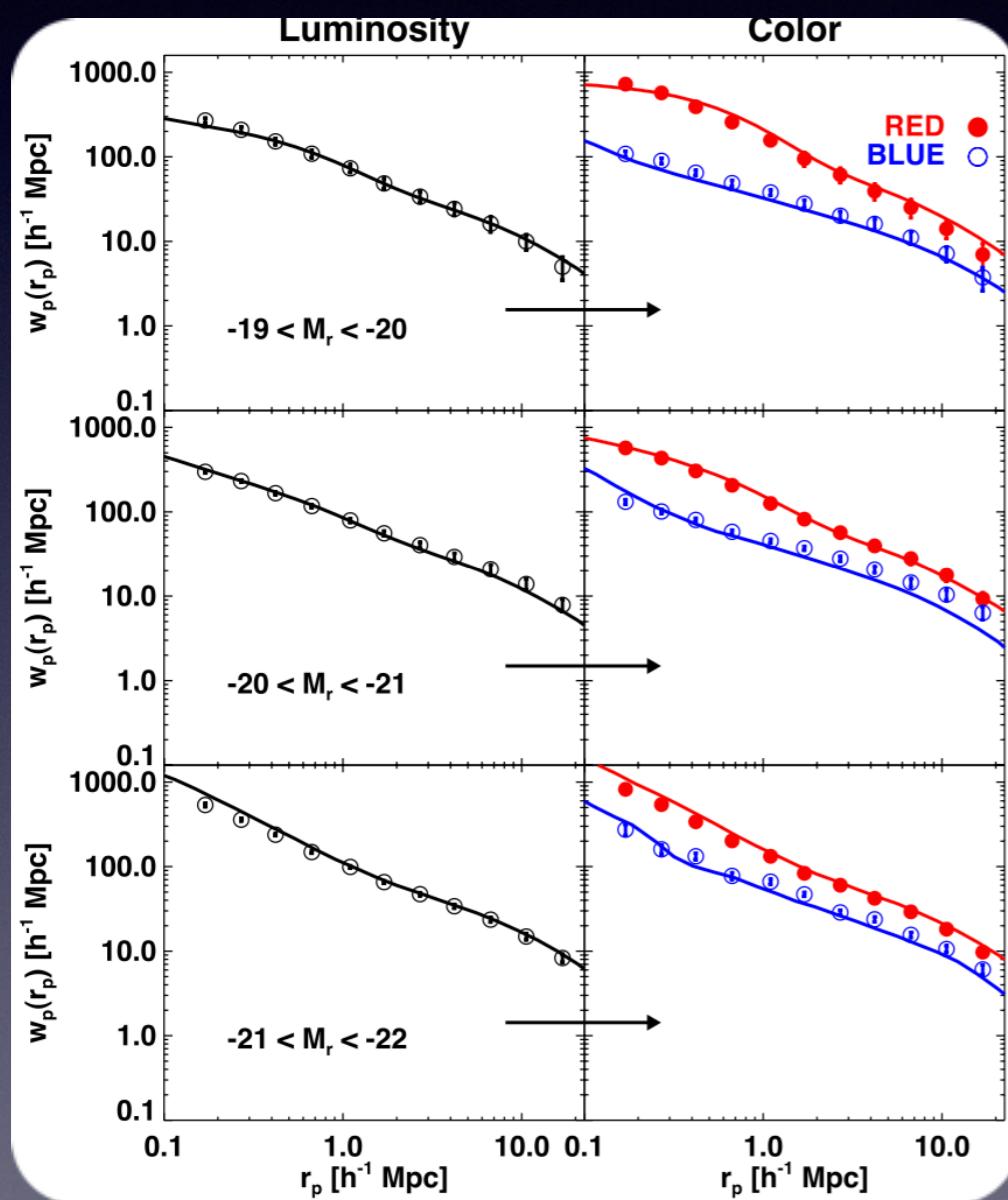
# Galaxy Assembly Bias

## Age Matching‡

Step 1: using an N-body simulations, abundance match  $L$  to  $V_{\max}$ .

Step 2: in bins of  $L$ , abundance match color to halo assembly time; reddest to oldest

Step 3: compute clustering as function of  $L$  and color and compare to data



Hearin & Watson 2013; Hearin et al. 2014

Age Matching accurately fits clustering of red and blue galaxies.

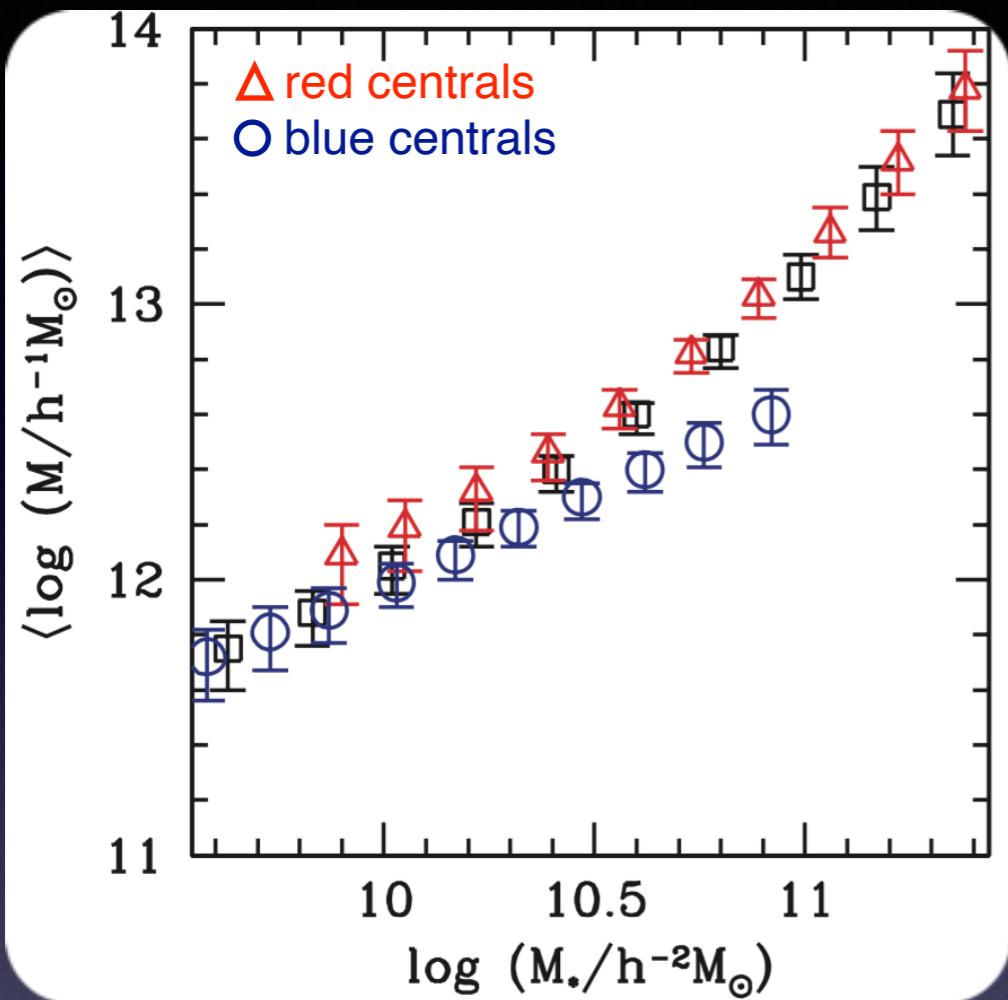
Proof of galaxy assembly bias ??

source: Hearin & Watson 2013

‡an example of conditional abundance matching (CAM)]

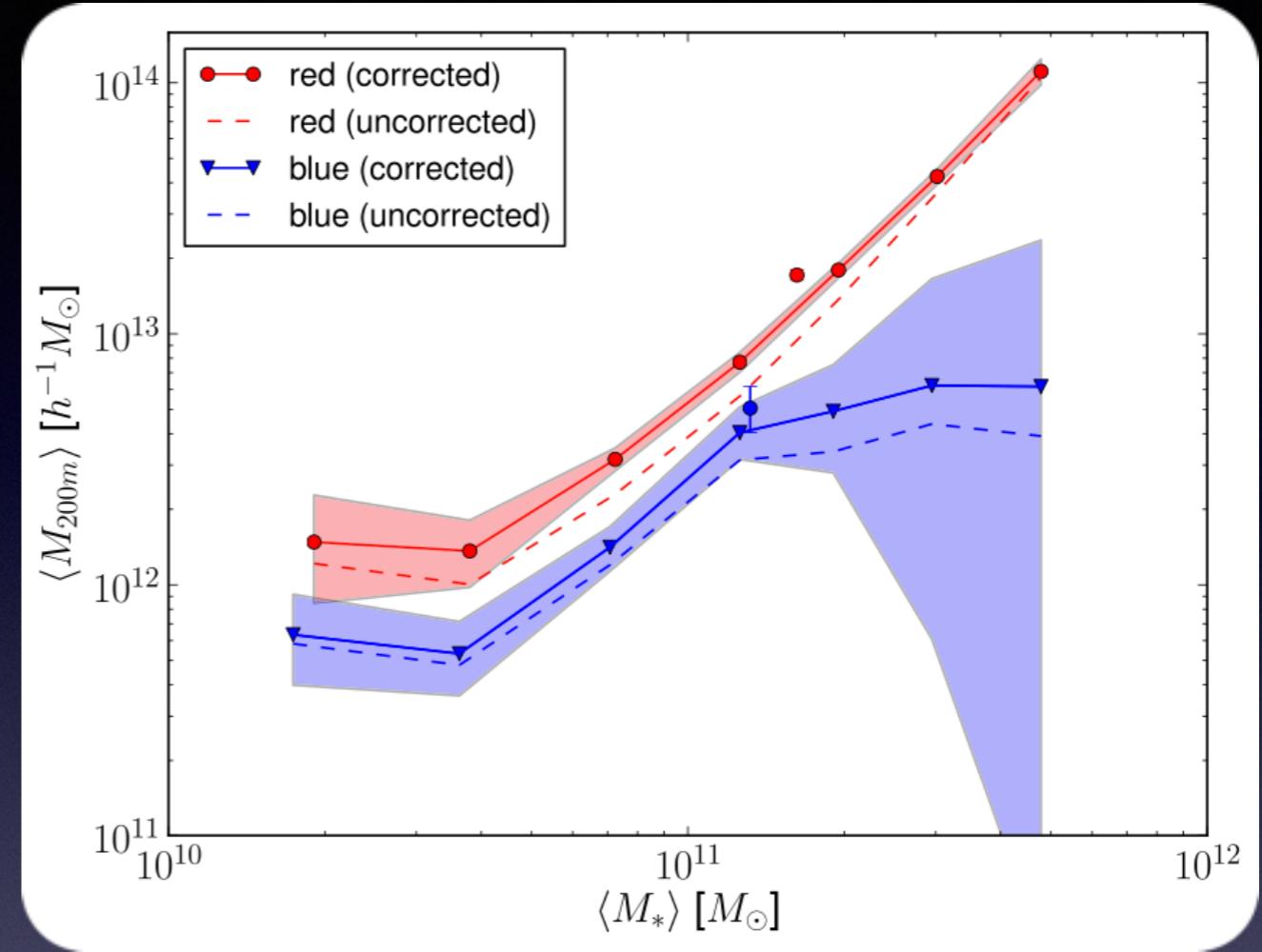
# Galaxy Assembly Bias

Satellite Kinematics



source: More, vdB et al. 2011

Galaxy-Galaxy Lensing



source: Mandelbaum et al. 2016

Satellite kinematics and galaxy-galaxy lensing shows that red centrals live in more massive halos, which can also explain their different clustering...

see also Rodríguez-Puebla et al. 2015; Zu & Mandelbaum 2015; Lange, vdB et al. 2019

Degeneracies are common and make it difficult to find unambiguous evidence for galaxy assembly bias

# Galaxy Assembly Bias

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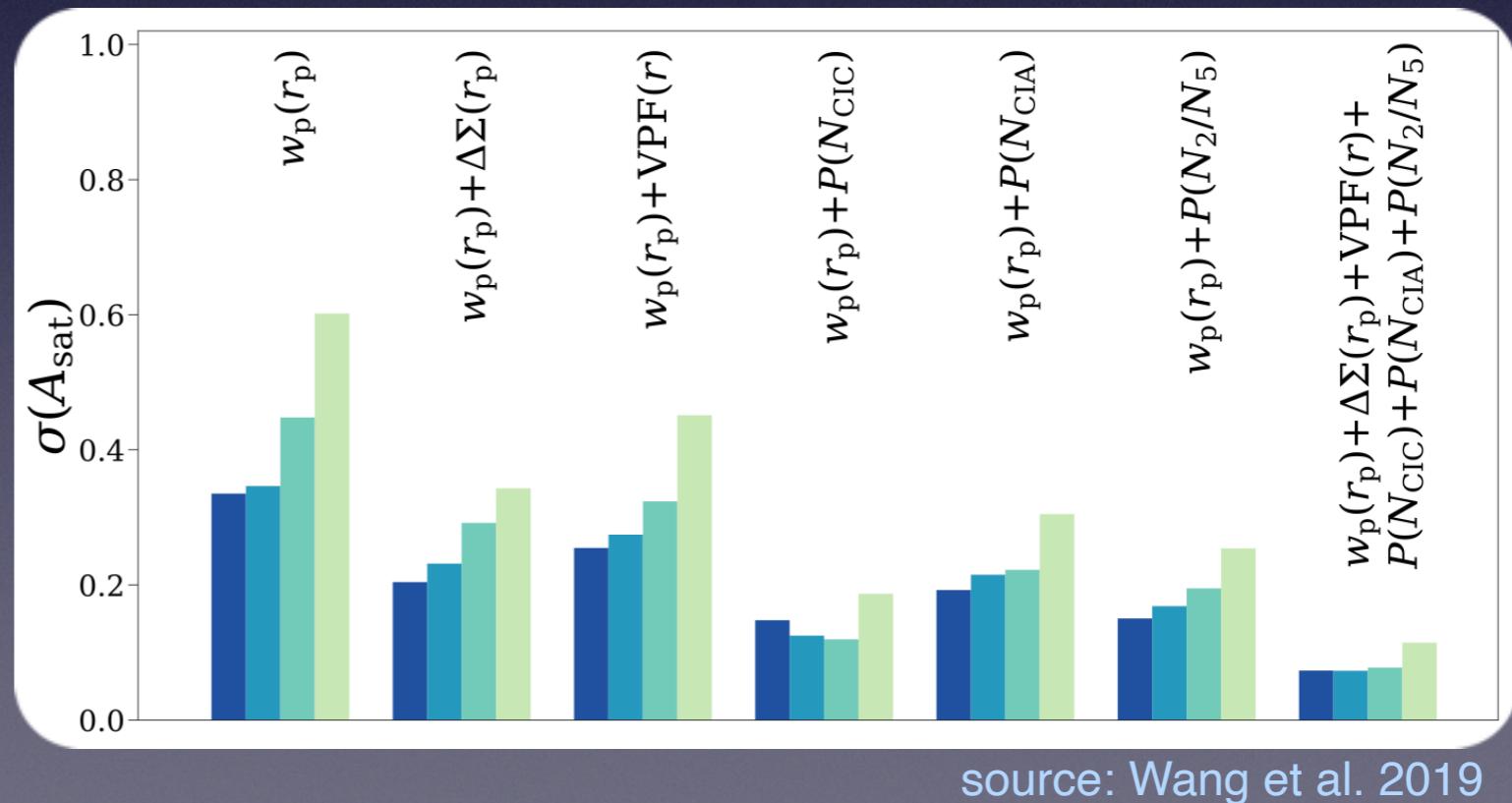
- data that is particularly good at breaking degeneracies

void-probability function

Walsh & Tinker 2019

counts-in-cells

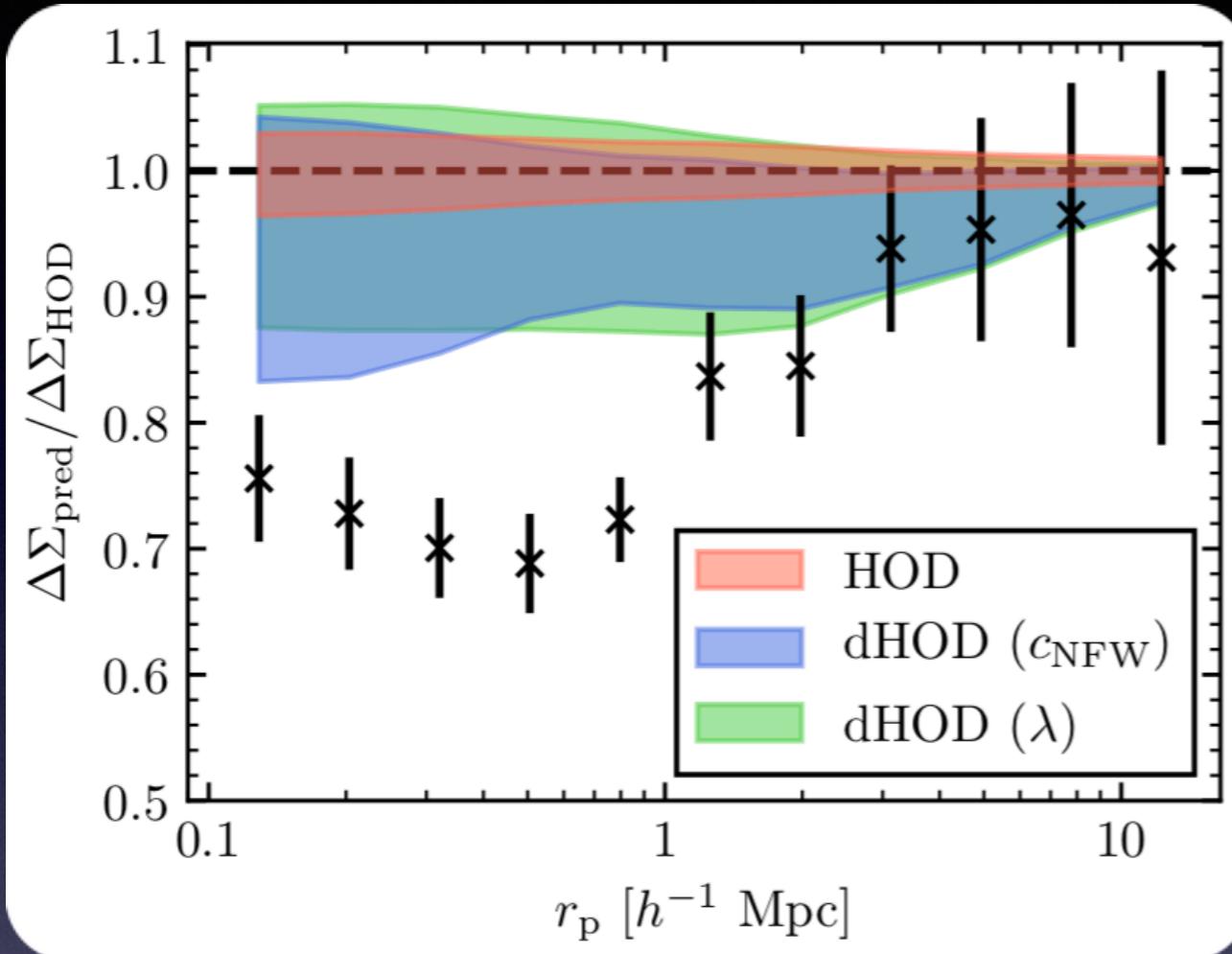
Wang et al. 2019



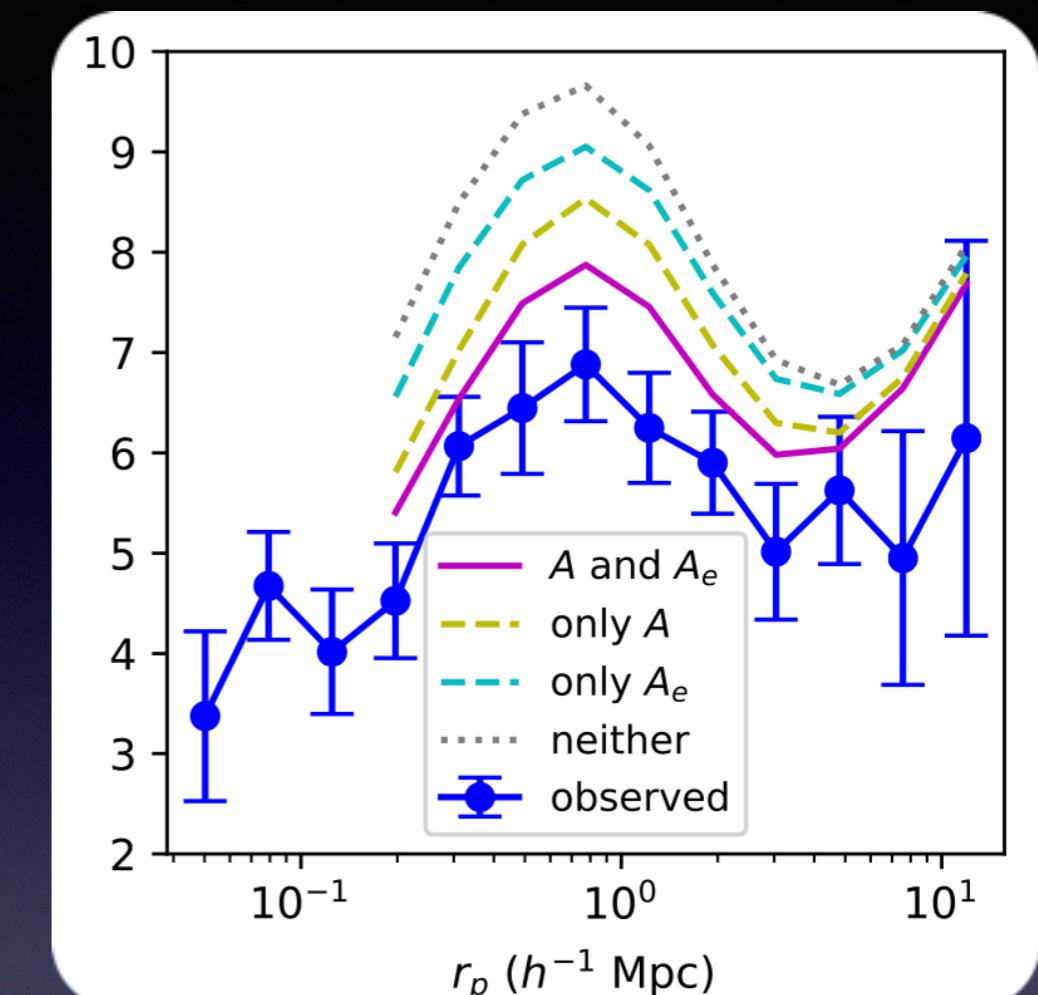
source: Wang et al. 2019



# Assembly Bias vs. $S_8$ Tension



source: Lange et al. 2019

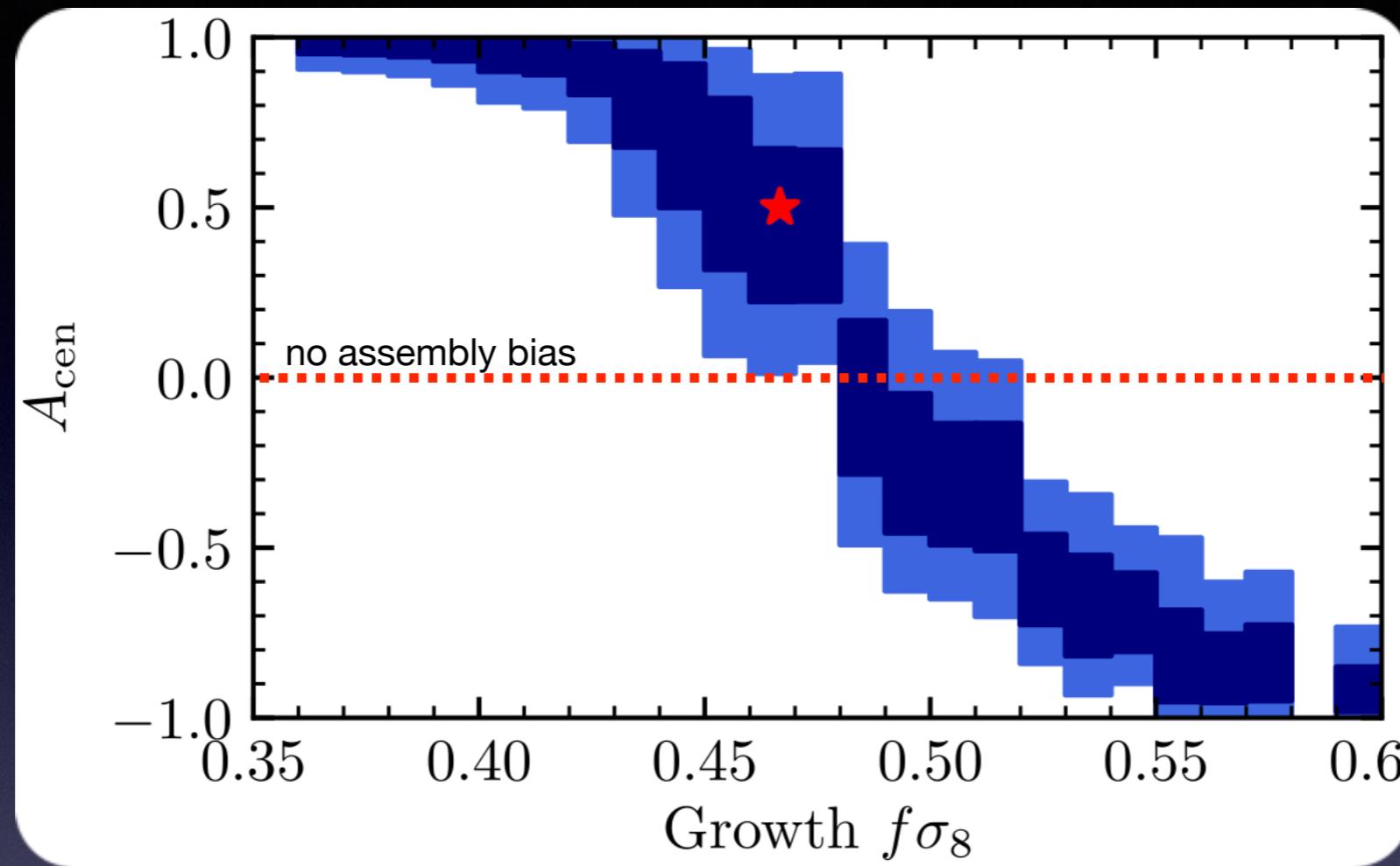


source: Yuan et al. 2021

Assembly bias unable to explain the lensing discrepancy?



# Assembly Bias vs. $S_8$ Tension



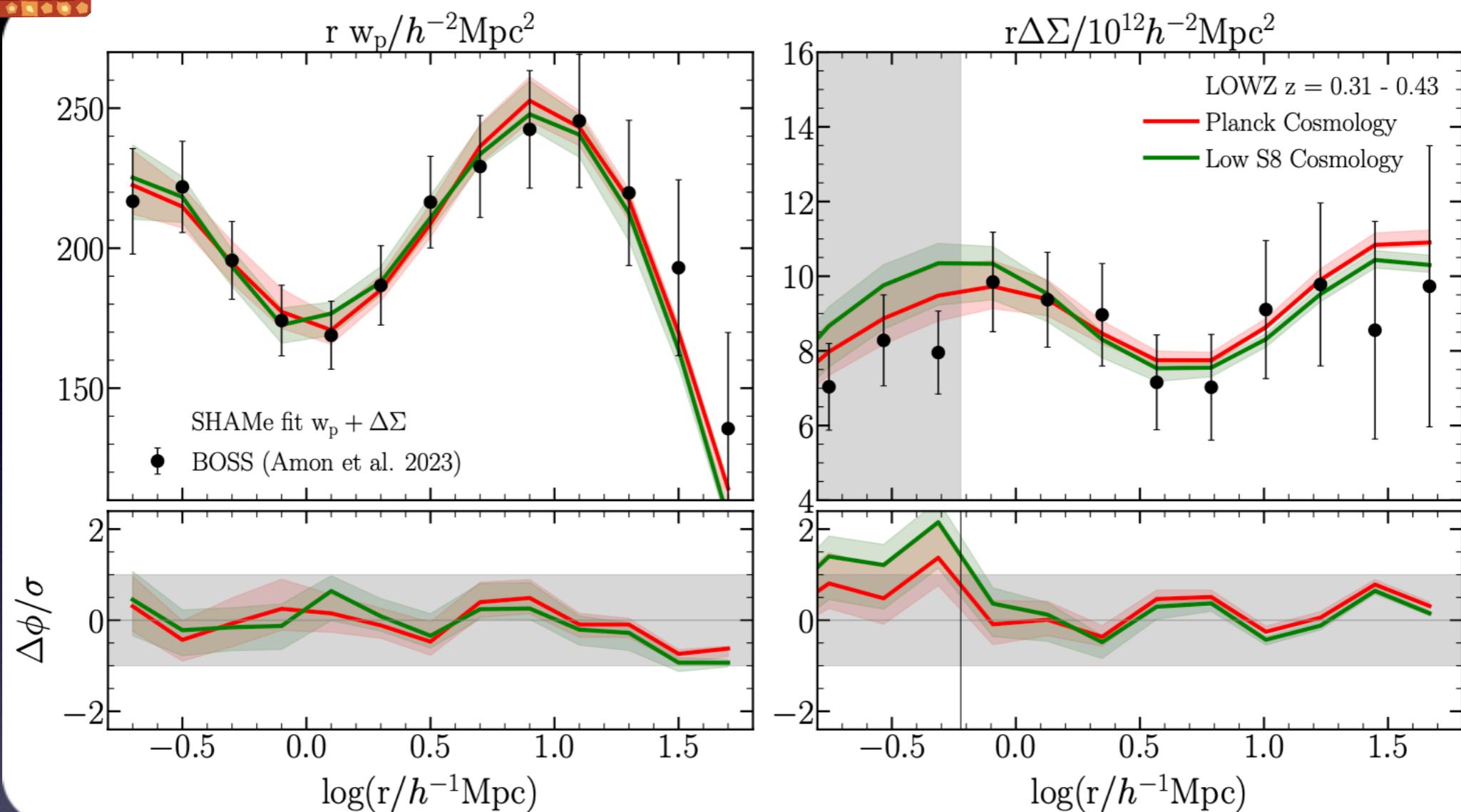
Source: Lange et al. 2019

Assembly bias is degenerate with cosmological parameters





# Assembly Bias vs. S<sub>8</sub> Tension



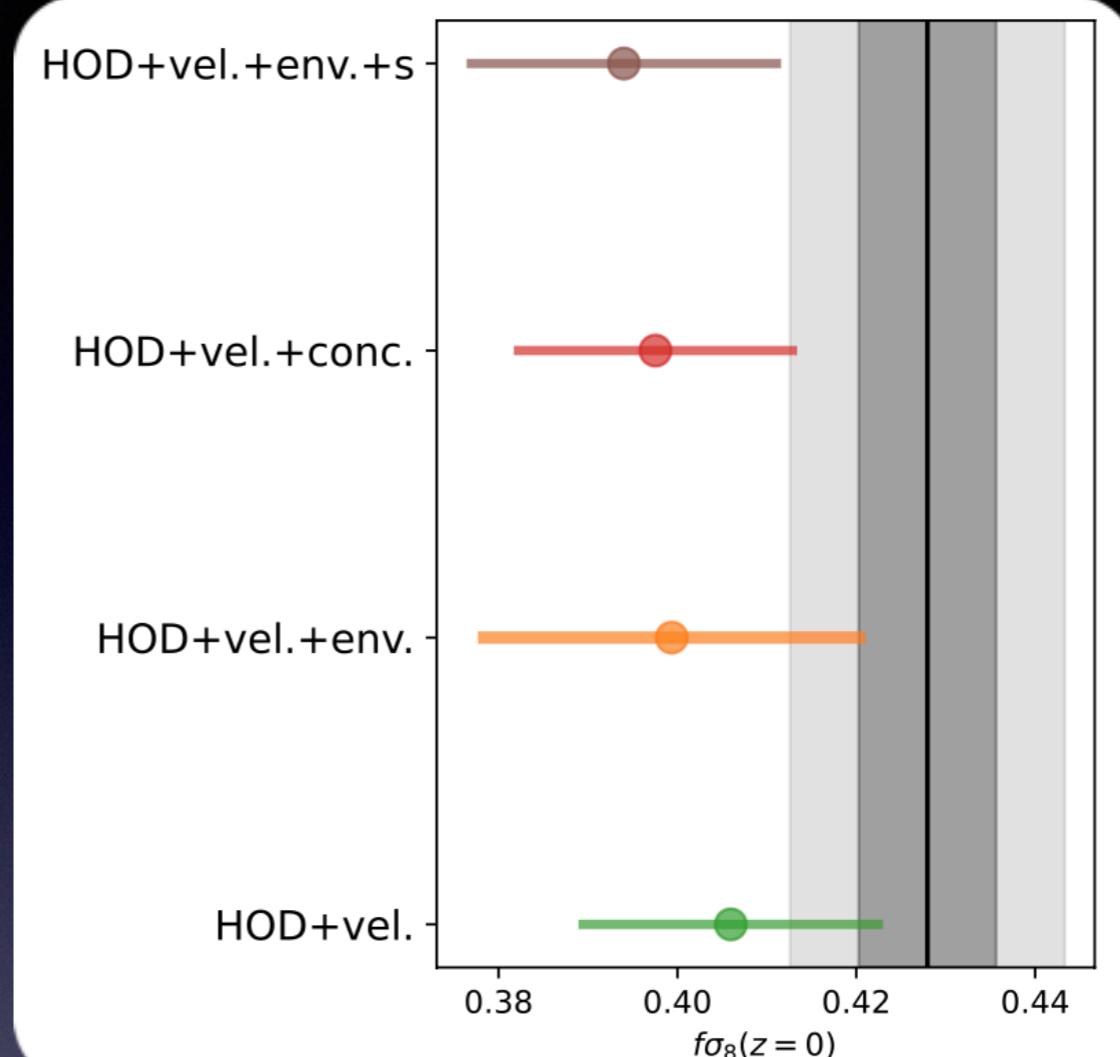
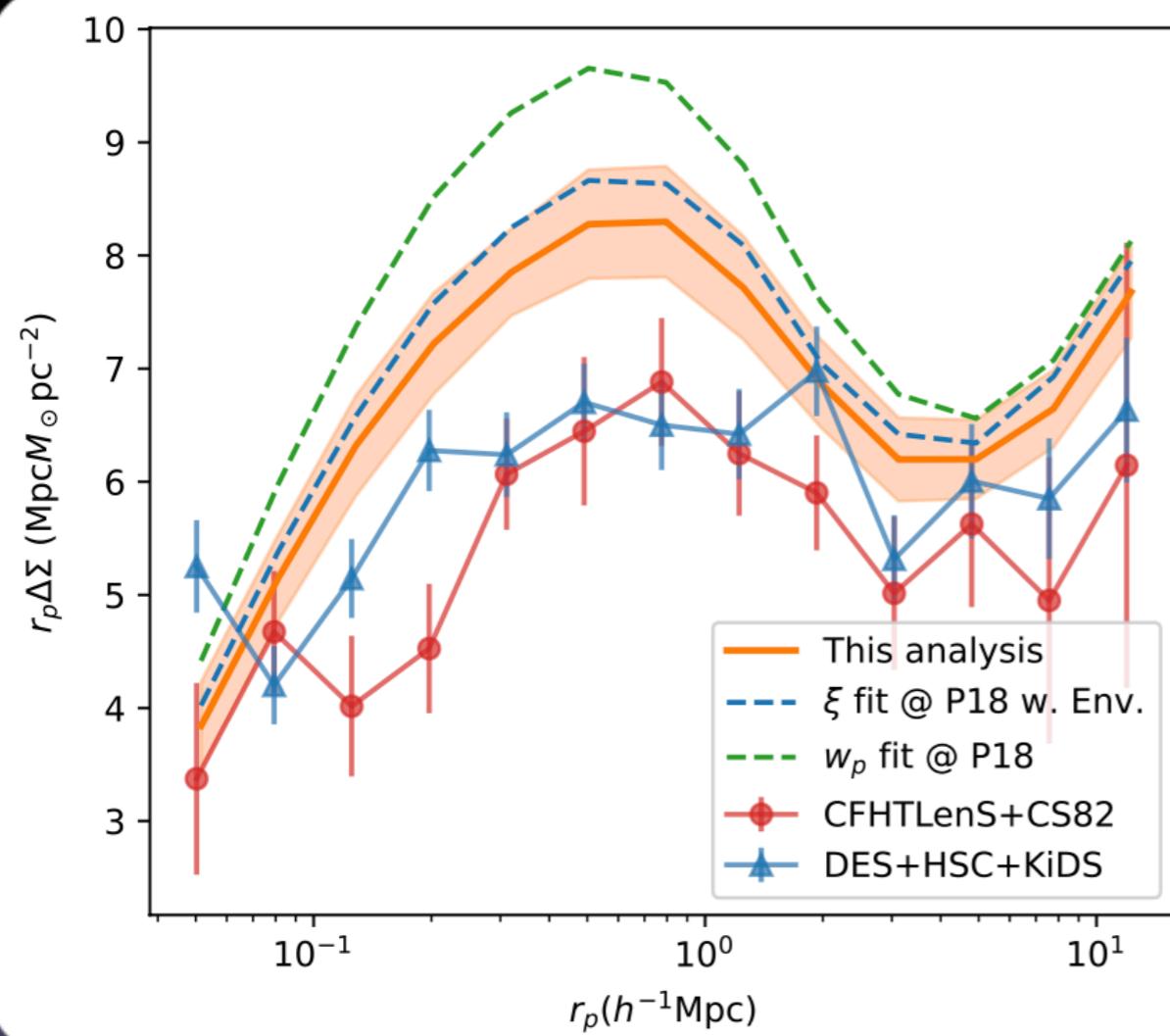
Source: Contreras et al. 2023

SHAMe: includes treatment of orphan galaxies  
secondary halo property used is large-scale environmental density

Assembly bias is degenerate with cosmological parameters  
and is flexible enough to solve the S8 tension?

see also Chaves-Montero et al. 2023

# Assembly Bias vs. $S_8$ Tension



Source: Yuan et al. 2022

**flexible HOD + emulator:** flexible radial profile of satellites

HOD has environment dependence to model galaxy assembly bias

Inconsistent with results of Contreras et al. 2023

The tension continues....

# lesson learned (again)

“Inconsistency is the only thing  
in which men are consistent”

[Horace Smith]

# The Galaxy-Halo Connection

## Constrain Cosmology

marginalize over galaxy formation

Assembly Bias is a condemnation

N-body simulations are a must  
but what about orphans?

Emulators & Cosmological Evidence Modeling  
lots of progress in recent years

Will we be able to break degeneracies?  
uncertain

How to deal with baryonic effects?  
marginalization or include gas?

Can we (ever) reach 1% accuracy?  
maybe; beat cosmic variance [see Angular & Pontzen 2016]

How to convince critics that marginalization  
is sufficiently general?

## Fix Cosmology

learn about galaxy formation

Assembly Bias is a blessing

N-body simulations are a must  
but what about orphans?

Only a few simulations needed  
to beat cosmic variance

Will we be able to break degeneracies?  
probably

How to deal with baryonic effects?  
marginalization or include gas?

No need for 1% accuracy

No marginalization