



# Cosmological Constraints from Galaxy Cluster Mass Profiles

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# Why and How ?

## Bibliography:

Balmes et al., MNRAS, 437, 2328 (2014)

Corasaniti, Etori et al., ApJ, 862, 40 (2018)

Corasaniti & Rasera, MNRAS, 487, 4382 (2019)

Corasaniti, Giocoli, Baldi, PRD, 102, 043501 (2020)

Corasaniti, Sereno, Etori, ApJ, 911, 82 (2021)

Richardson & Corasaniti, MNRAS, 513, 4951 (2022)

Corasaniti, Le Brun, Richardson et al., MNRAS, 516, 427 (2022)

## Collaborators:

A. Le Brun, Y. Rasera, T. Richardson, I. Saez (LUTH)

S. Etori, M. Sereno, C. Giocoli, M. Baldi (Bologna)

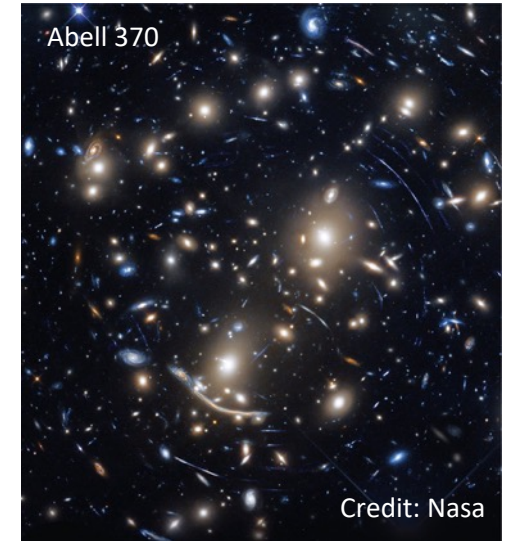
D. Eckert, V. Ghirardini (MPE), S. Amodeo (Strasbourg)

M.-A. Breton (ICE-Barcelona), M. Arnaud, G. Pratt (CEA)

# Galaxy Cluster Cosmology

## Cosmic Probes

- Largest Most Massive Structures in the Universe
- Ultimate Result of Hierarchical Bottom-Up Structure Formation Process
- X-ray, SZ, Optical & Near-IR
- Cluster Abundance, Baryon Fraction, Spatial Clustering & Internal Mass Distribution



# Cluster Number Counts

- *Planck*-SZ Catalog
- SPT-SZ, XXL, DES
- Low  $\Omega_m$  &  $\sigma_8$
- Primary Systematics: Mass Calibration Bias, Selection, Halo Mass Function Model

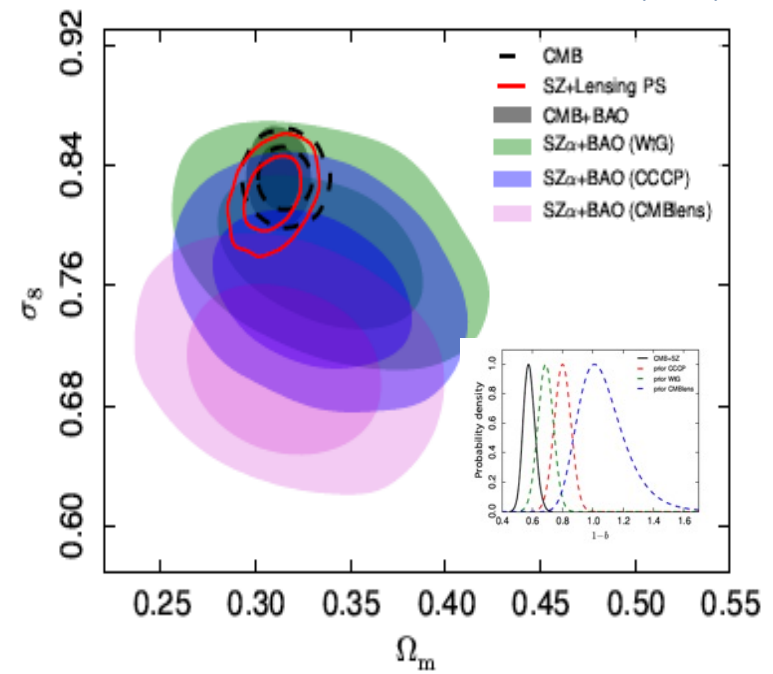
# Baryon Fraction

- $f_{\text{gas}} = M_{\text{gas}}/M_{\text{tot}} \sim f_{\text{baryon}} = \Omega_b / \Omega_m$
- Primary Systematics: Mass Calibration Bias, Gas Depletion

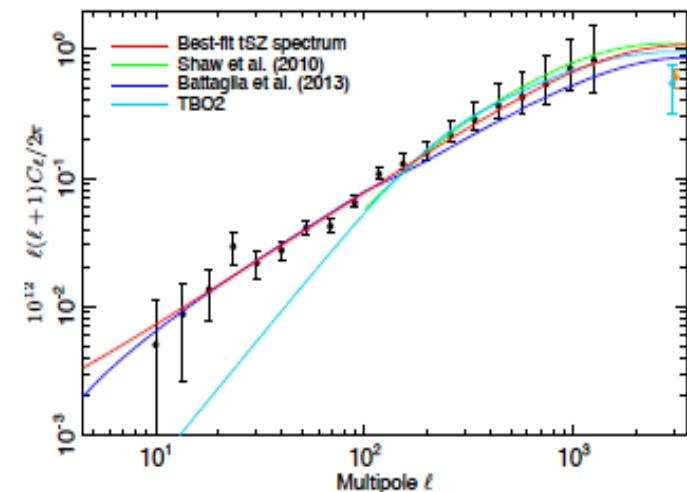
# Spatial Clustering

- 2-Point Correlation Function SZ Sources
- Primary Systematics: Selection Function, Halo Bias Model, Secondary Sources

Planck Collaboration (2016)



Planck Collaboration (2016)



# NFW-Profile

## Universal Profile

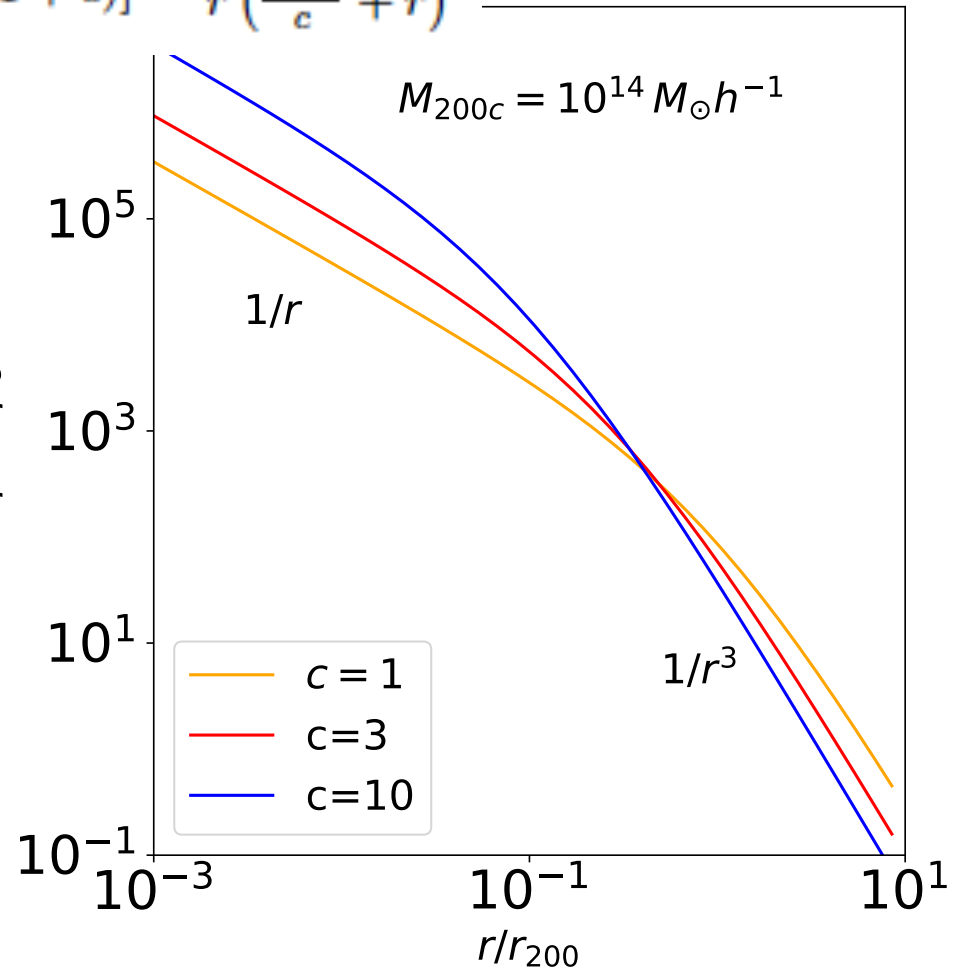
$$\rho_{\text{NFW}}(r) = \frac{M_{200}}{4\pi[\ln(1+c) - c/(1+c)]} \times \frac{1}{r \left(\frac{r_{200}}{c} + r\right)^2}$$

$$c = \frac{r_{200}}{r_s}$$

Navarro, Frenk & White (1997)

$$\rho_{\text{NFW}}(r) \propto \begin{cases} r^{-1} & r \ll r_s \\ r^{-3} & r \gg r_s, \end{cases} \quad \rho(r)/\rho_c$$

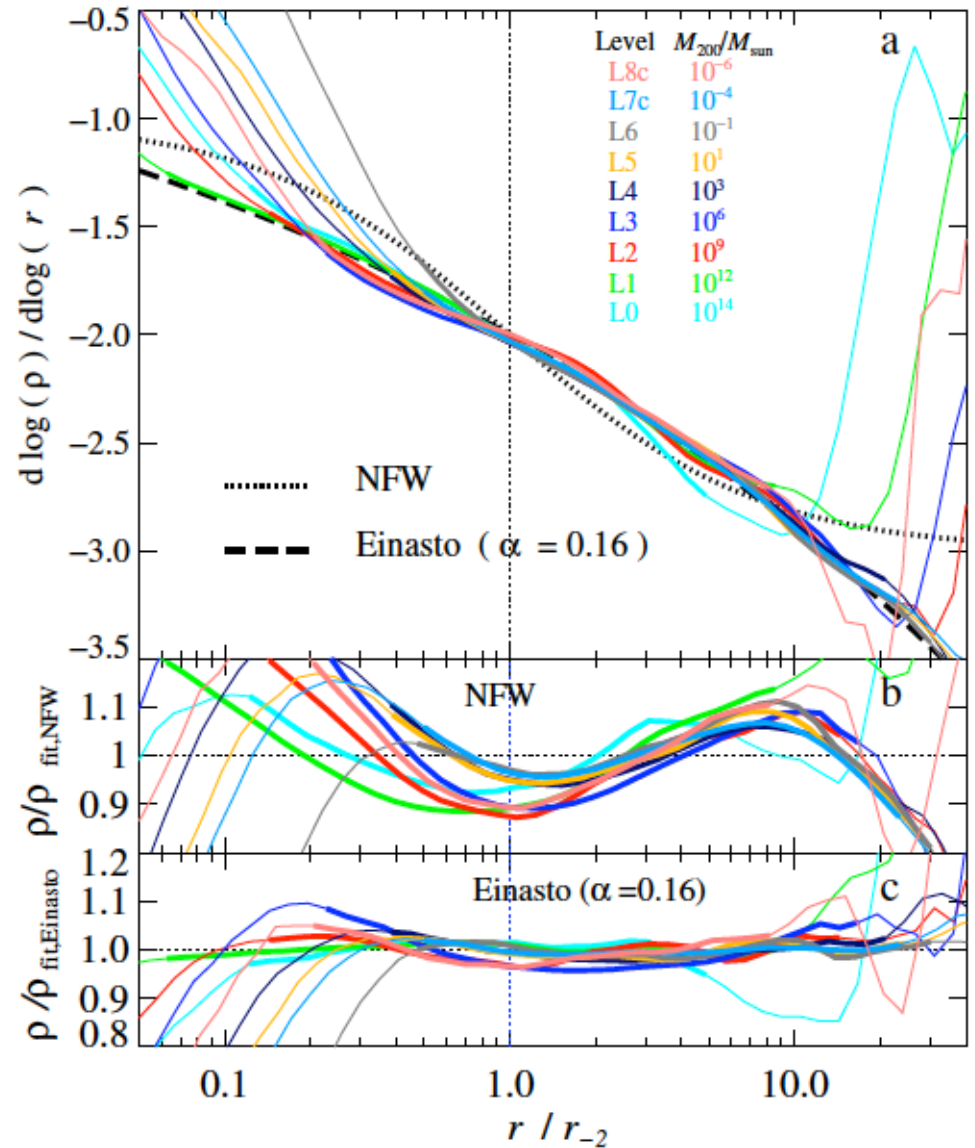
- The smaller  $r_s$  the more compact the halo
- $c$  is a proxy of halo concentration





# Universality of Halo Profile

- Successive N-body zoom simulations
- Average profile of dozen most massive halos at each refinement level
- Spans 20 order mass scales
  - NFW ( $< 10\%$ )
  - Einasto ( $< 5\%$ )
- Origin of Universality?
  - Gravity + Initial Scale Invariant Spectrum



Wang et al. (2020)

# Concentration-Mass Relation

## Halo Density Profile

- $c$  = random variate
- Median

$$c(M, z) = \frac{c_0}{1+z} \left( \frac{M}{10^{14} h^{-1} M_{Sun}} \right)^\alpha$$

- scatter

$$\sigma_{\ln c} \sim 0.3 \text{ (large)}$$

- Correlates with halo formation time and mass assembly history

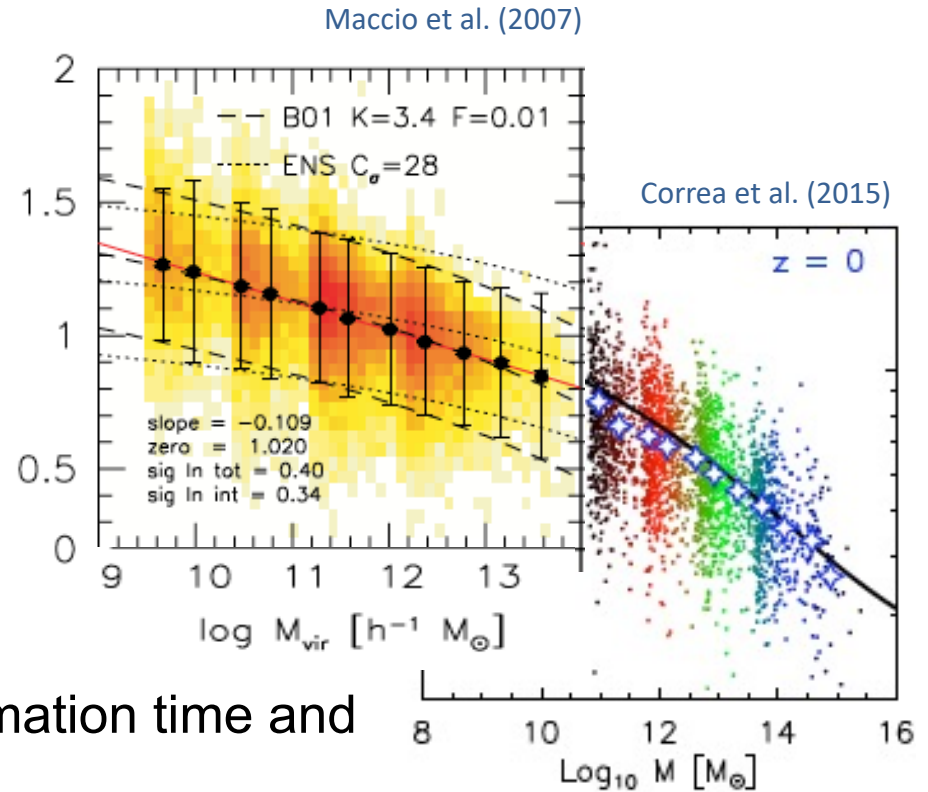
see e.g. Zhao et al. (2003), Ludlow et al. (2012)

## Cosmology

- $\alpha \sim -0.1$ ;
- $c_0$  : cosmology dependent;

$$c_0 \rightarrow c_0^{\Lambda\text{CDM}} \cdot \frac{D_+(z_{coll})}{D_+^{\Lambda\text{CDM}}(z_{coll})}$$

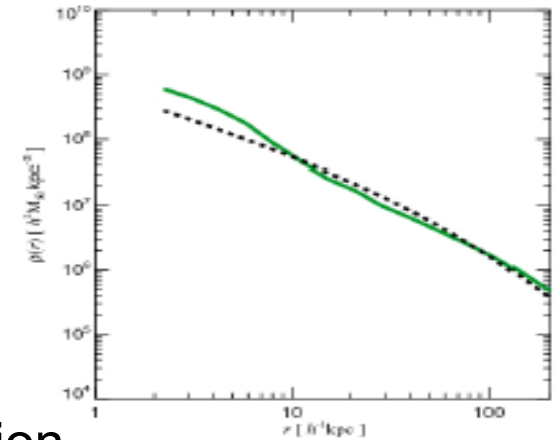
Klypin et al. (2003); Dolag et al. (2004)



# Observational Challenges

## Systematic Effects

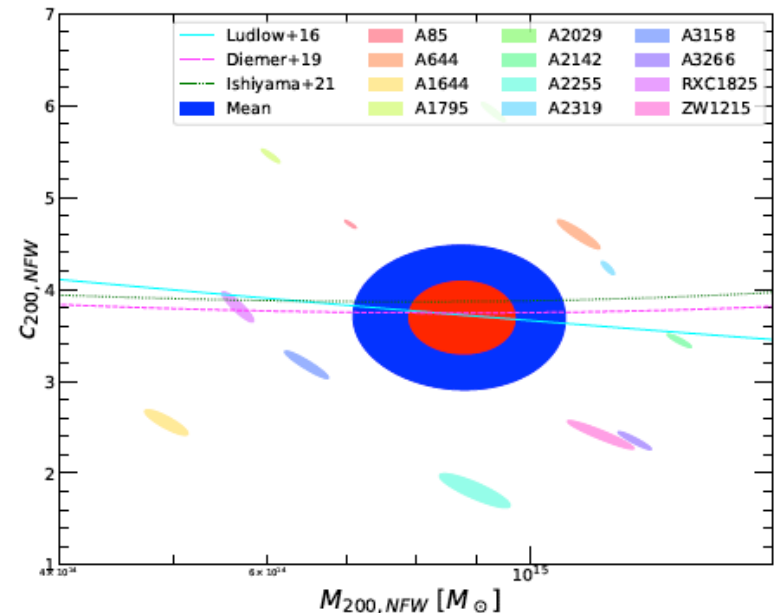
- Impact of Cooling, Star Formation, SN & AGN feedback
- X-ray Observations: Deviations from HE  
e.g. Gnedin et al. (2004); Duffy et al. (2010); De Boni et al. (2013); Rasia et al. (2013)
- Lensing Observations: Shape & Orientation  
e.g. Oguri et al. (2005); Corless, King & Clowe (2009), Sereno et al. (2013)
- Selection Effects  
Sereno et al. (2014)



Mead et al. (2010)

## X-COP Concentrations

- Large Scatter
- Consistent with c-M relations in literature
- No cosmological constraints out of it

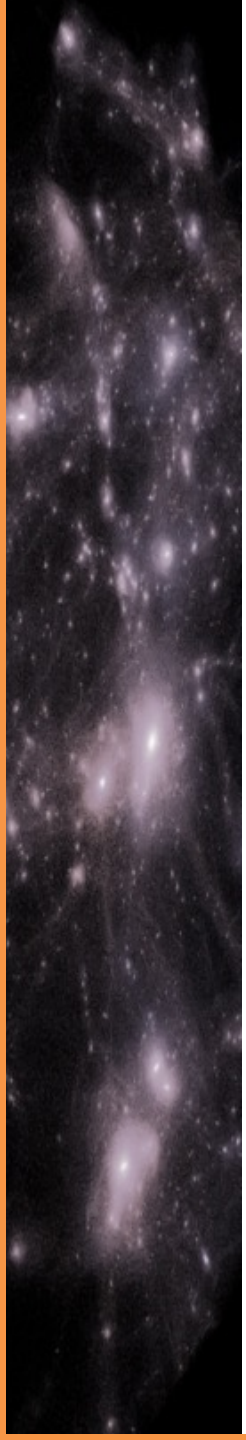


Eckert, Ettori, Pointecouteau, van der Bourg, Loubser (2022)



# Claim

**There is cosmological and astrophysical information encoded in the mass profile of halos which goes beyond what is parametrized by the NFW profile!**

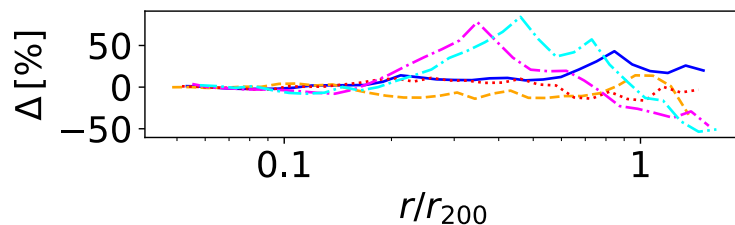
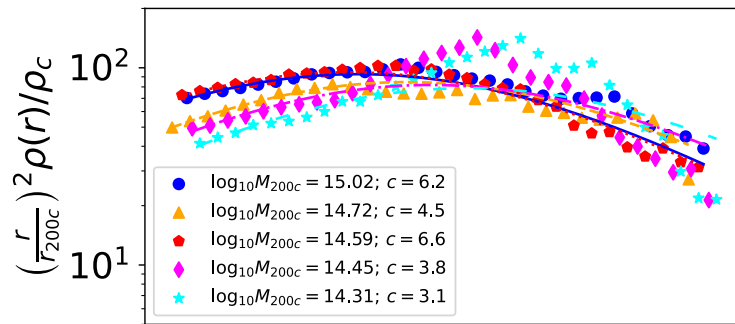
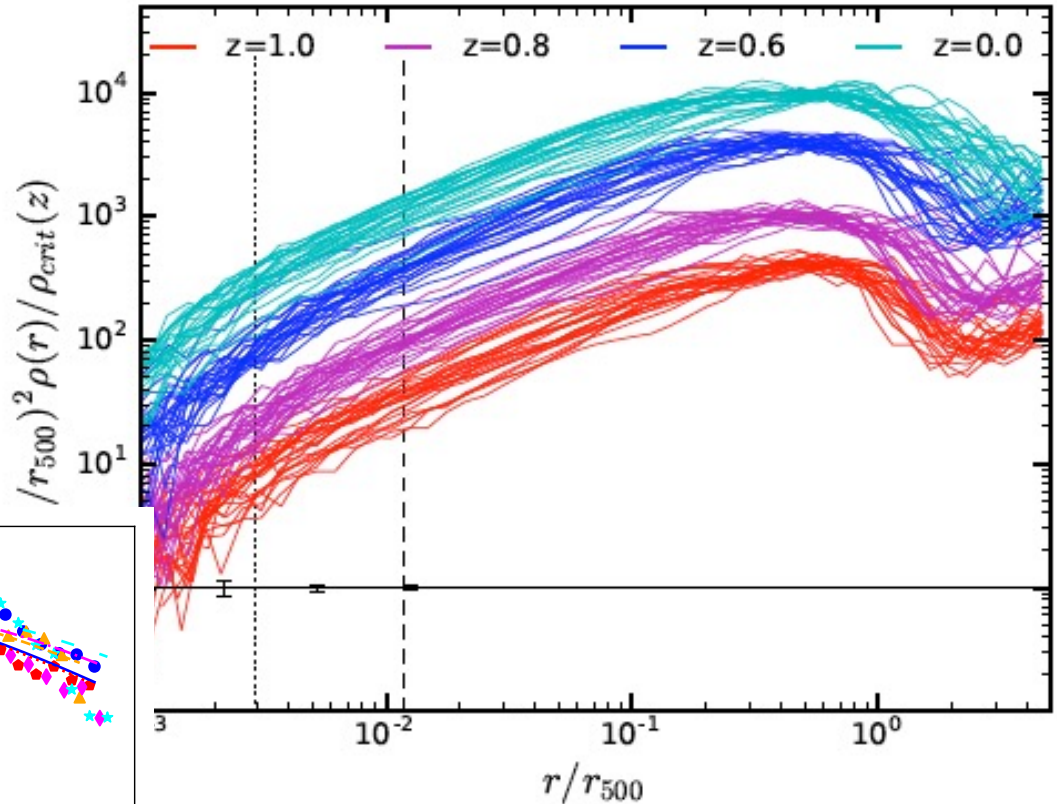


# N-body Halo Profiles

Le Brun et al. (2018)

## Perturbed Profile

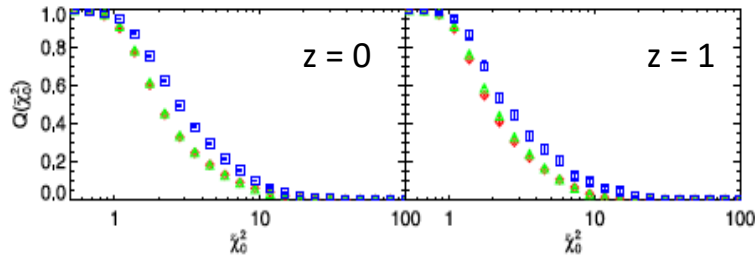
- Zooms of 25 massive halos  $\sim 10^{15} M_{\text{sun}} h$
- Negligible Poisson Errors
- Scatter: sub-structures and perturbed state



- Five most massive Bolshoi halos
- Deviations  $\sim 10\%$  relaxed halos
- Impact NFW goodness-of-fit

# Perturbed Halo Profiles

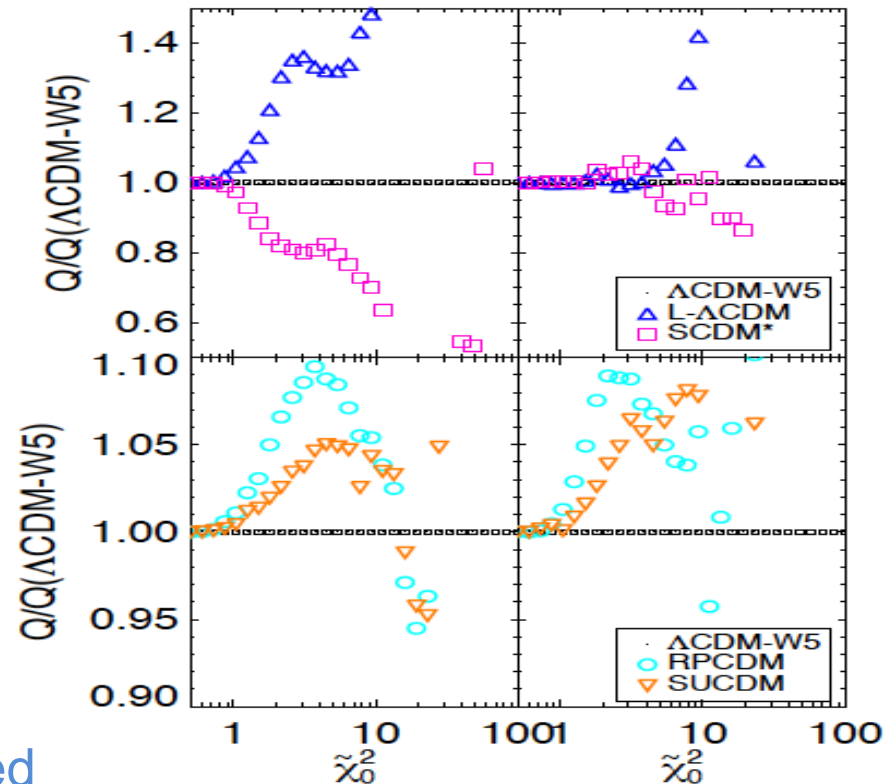
## NFW Goodness-of-fit



- Cumulative Reduced  $\chi^2$ -distribution
- 10% of halos  $>2\sigma$  deviation from NFW
- Deviations larger for massive halos

- Deviations strongly correlates with underlying model

- The less efficient the structure formation with respect to reference model the larger the fraction of halos deviating from NFW



Non-parametric proxy needed



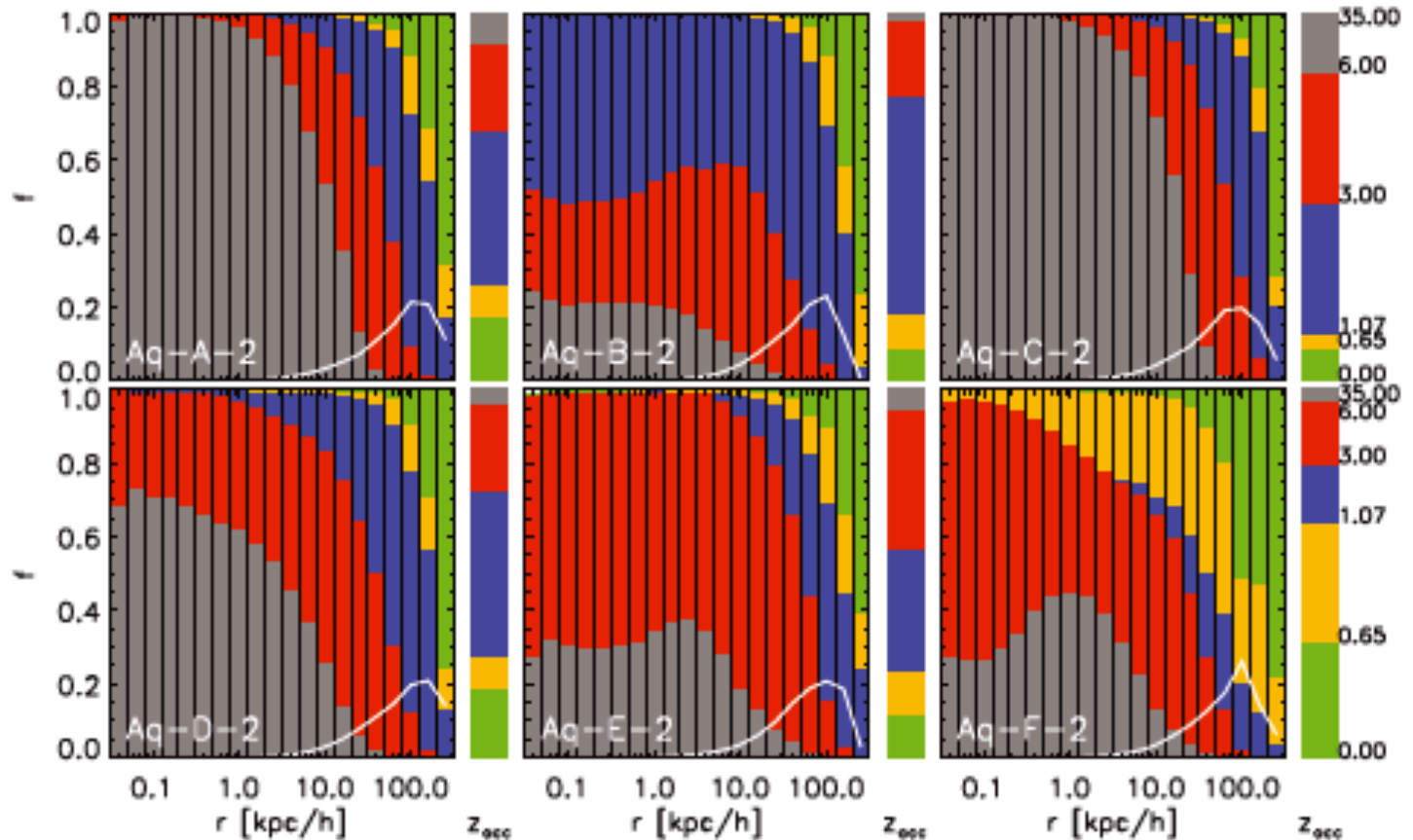
# Proxy of Halo Mass Profile

- Non-parametric Observable Estimator
- Capture differences in radial halo mass distribution
- Probe region of choice
- Retrieve cosmological information
- Easily predictable

# Halo Structure

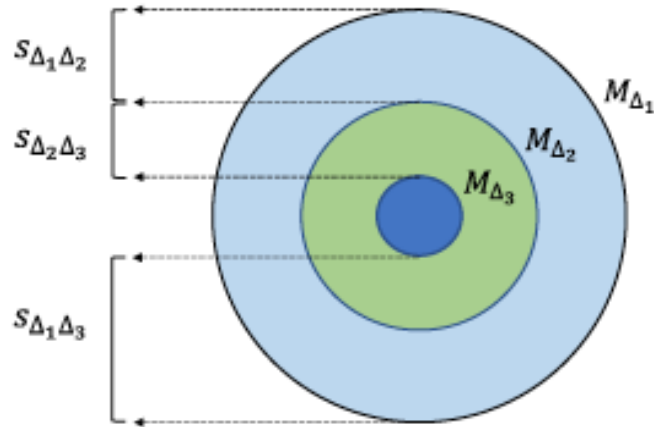
## Aquarius Halos

- Halo form inside-out (Onion-like structure)





# Halo Sparsity



**Mass Ratio:**

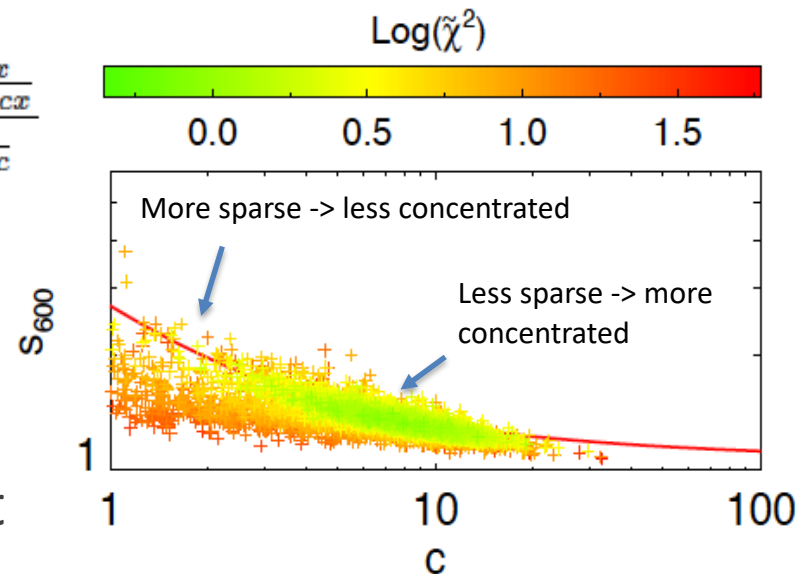
$$s_{\Delta_i\Delta_j} = \frac{M_{\Delta_i}}{M_{\Delta_j}} \equiv \frac{\Delta M}{M_{\Delta_j}} + 1$$

- $\Delta_i < \Delta_j$
- $\Delta_i \geq 100$  (preserve halo individuality)
- $\Delta_j \leq 2000$  (avoid baryon dominated region)

## Sparsity of NFW Halos

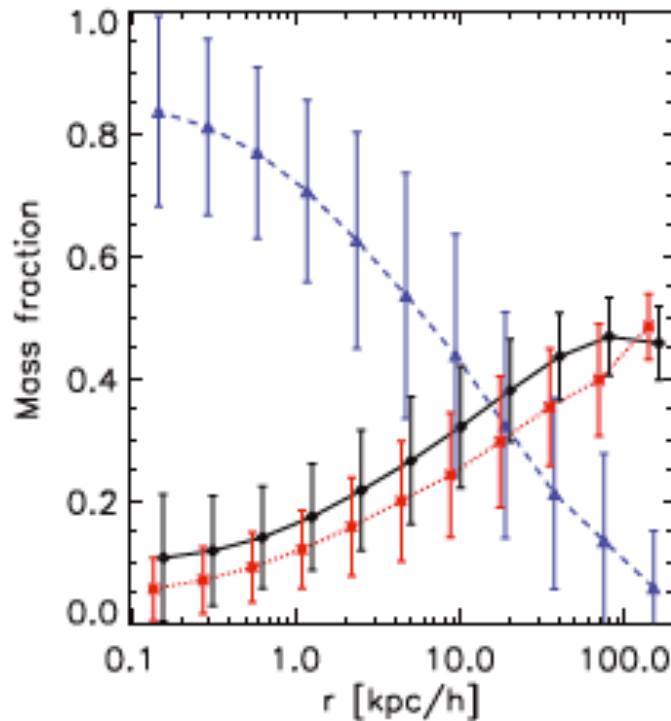
$$s_{\Delta} = \frac{200}{x^3 \Delta} \quad \& \quad x^3 \frac{\Delta}{200} = \frac{\ln(1 + cx) - \frac{cx}{1+cx}}{\ln(1 + c) - \frac{c}{1+c}}$$

- Halos with  $<1\sigma$  NFW along the expected relation
- Distributed nearly constant value with small scatter



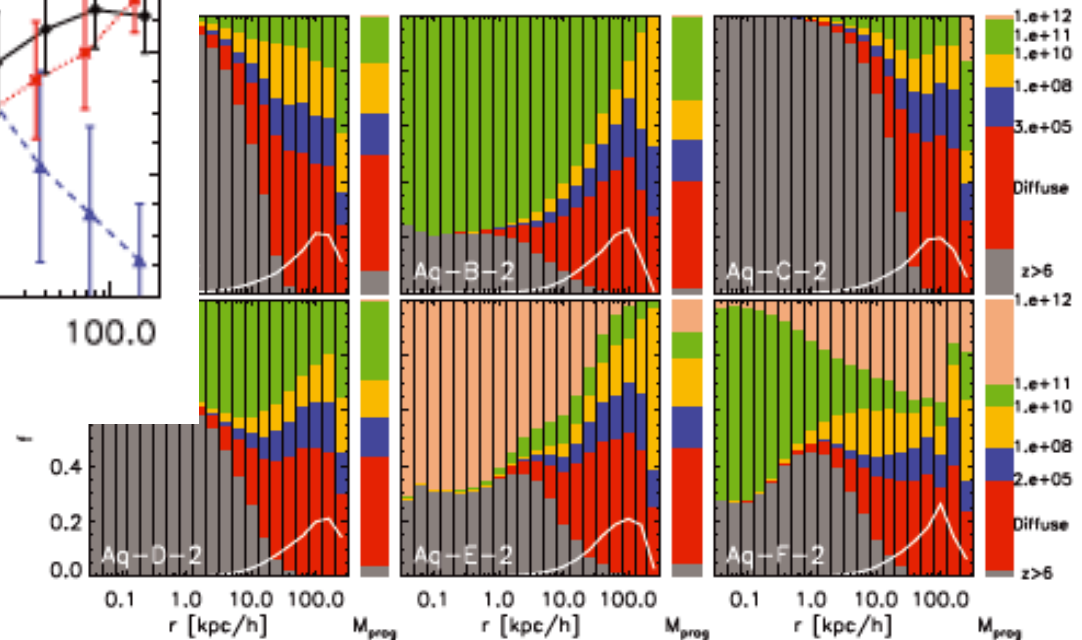
# Halo Mass Distribution

## Aquarius Halos



- Major Mergers ( $\sim$ inner regions)
- Diffuse Matter Accretion & Minor Mergers ( $\sim$ external regions)

- Diffuse Matter contributes non-negligibly to final halo mass



# Halo Assembly History

## Halo Growth

- Fast Accretion (Major Mergers)
- Slow Smooth Accretion (Minor Mergers & Diffuse Matter)

see e.g. Zhao et al. (2003), Li et al. (2007)

## Pseudo-Evolution

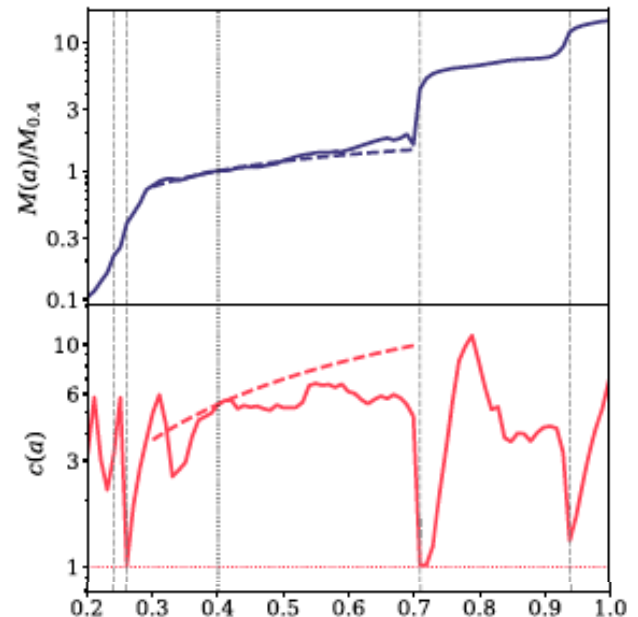
- Halo mass evolution due to reference density  $M_{\Delta}(z) = \frac{4}{3}\pi R_{\Delta}^3(z)\Delta(z)\rho_{\text{ref}}(z)$

Diemer, More, Kravtsov (2013)

## Slow vs Fast Accretion

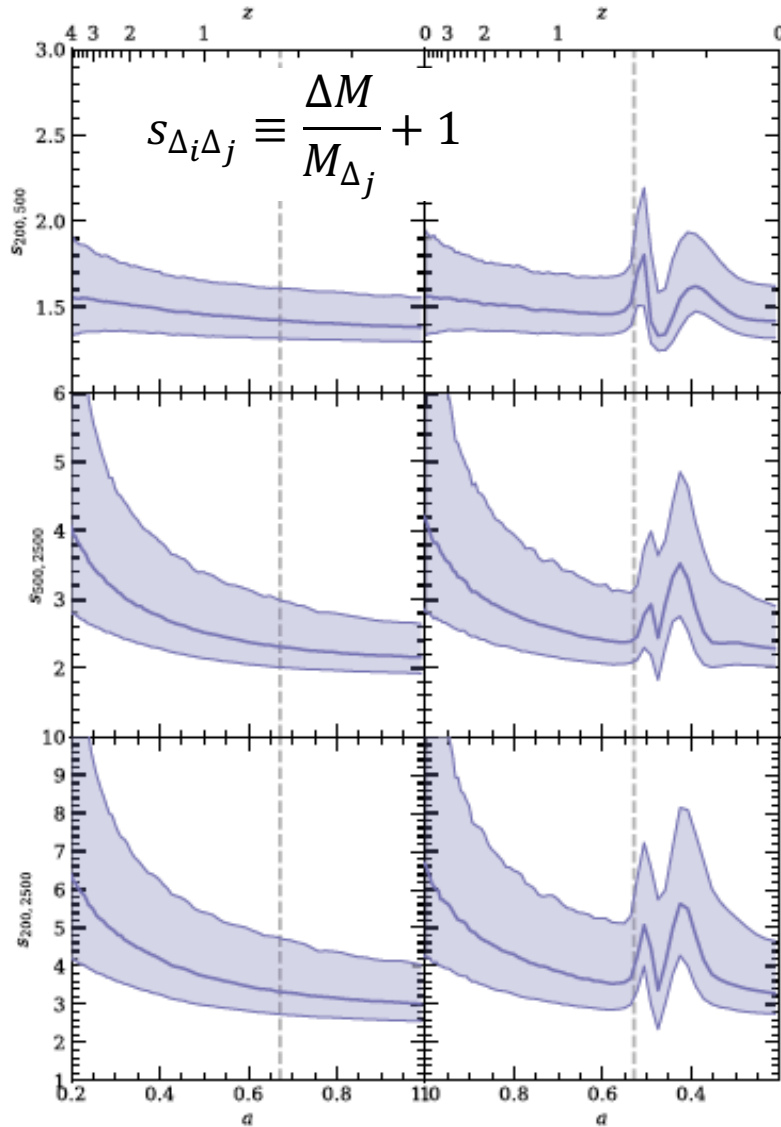
- Concentration deviates from pseudo-evolution
- Scatter due to stochastic minor mergers during slow accretion
- Universal response during major mergers with large excursion

K. Wang et al. (2020)



# Halo Sparsity Evolution

## Slow vs Pulse-like Evolution



### Quiescent Halos Average Sparsities:

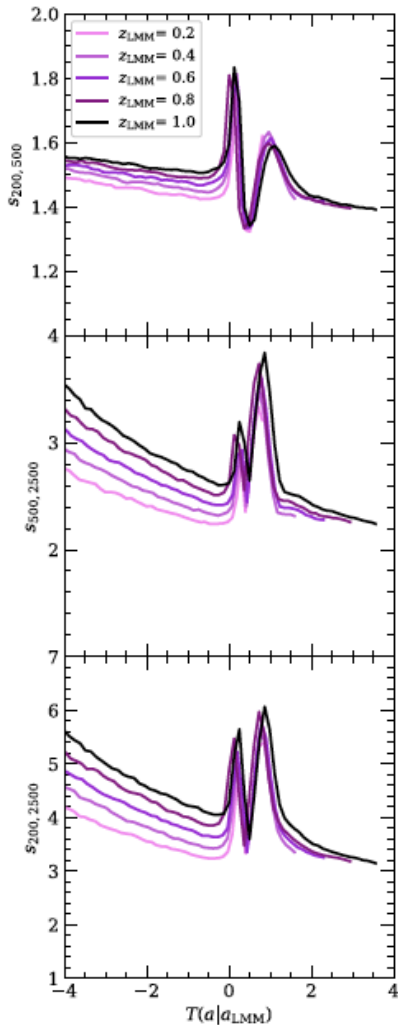
- Nearly Constant Evolution Outer Region
- Decreasing Trend Inner Region

### Average Sparsities of Major Mergers $z = 0.5$ :

- Quiescent Evolution Before Merger
- Pulse-like Shape:
  - First Peak = Merger Enters Outer Region
  - First Dip = Merger Arrives Cores
  - Second Peak = Merger within  $< R_{500c}$

# Major Merger Response

## Universality



- Identical Behavior (in units of dynamical time)

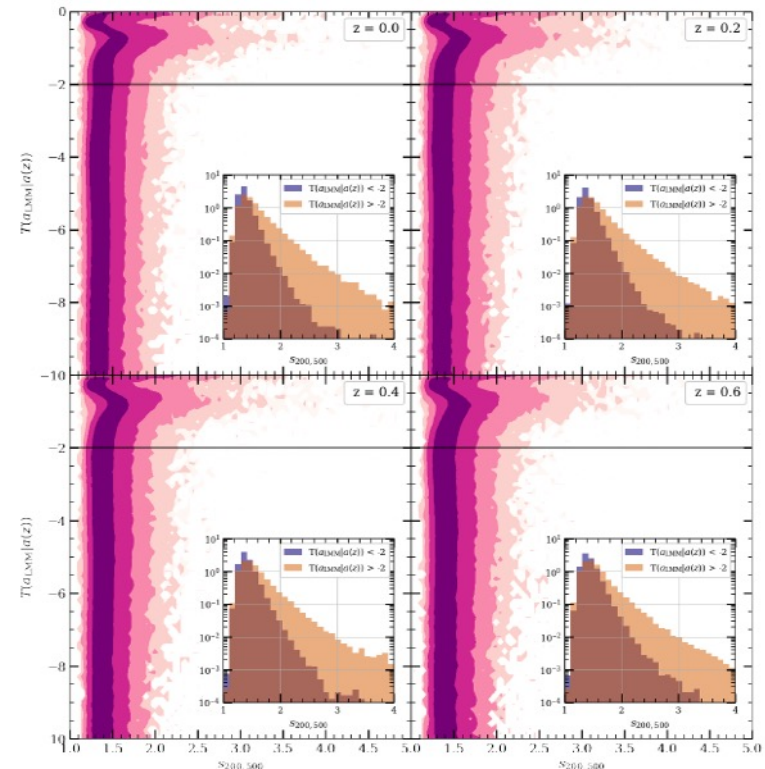
$$T(z; z_{\text{LMM}}) = \frac{\sqrt{2}}{\pi} \int_{z_{\text{LMM}}}^z \frac{\sqrt{\Delta_{\text{vir}}(z)}}{z+1} dz$$

see also Wang et al. (2020) for concentration

- Quiescent Evolution Recovered  $t > 2T$

- Halo Population:

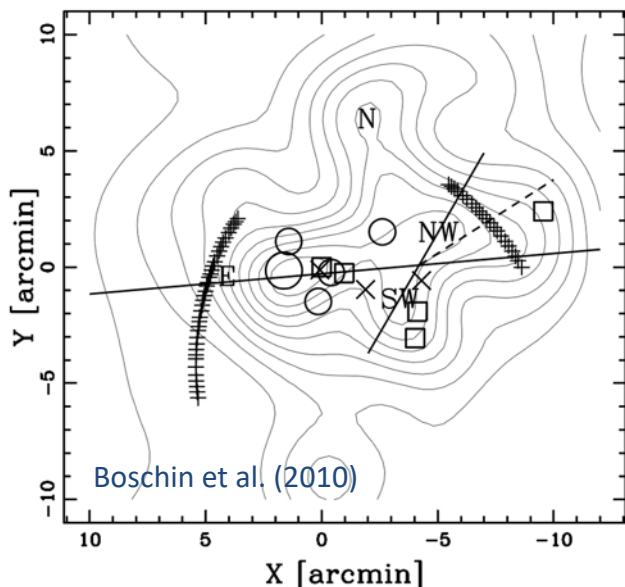
- Perturbed Halos ( $< 2T$  from last major merger)
- Contribute to scatter in sparsity
- Quiescent Halos





# ABELL 2345

## Lensing & Radio Relics



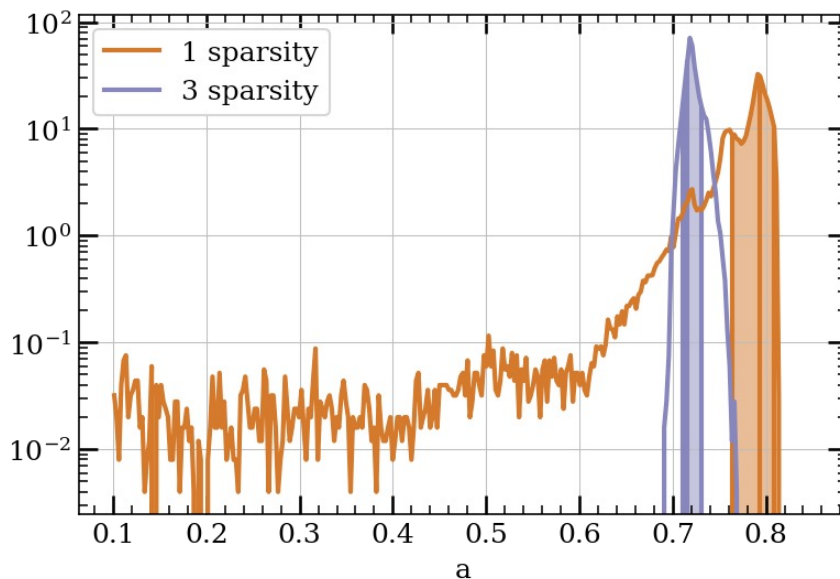
- Redshift  $z = 0.176$
- Lensing Masses ( $10^{13} M_{\text{sun}}/h$ )
  - $M_{2500c} = 0.32 \pm 0.12$  Okabe et al. (2010)
  - $M_{500c} = 6.52 \pm 2.47$
  - $M_{200c} = 28.44 \pm 10.76$
- Sparsities:
  - $S_{200,500} = 4.26 \pm 2.33$
  - $S_{200,2500} = 87.50 \pm 46.83$
  - $S_{500,2500} = 20.06 \pm 10.93$

- Uchuu Simulations  
Calibrated Distributions
- Timing the merger event:

$$z_{LMM} = 0.396 \pm_{0.03}^{0.01}$$

$$|T| = 0.86 \tau_{\text{dyn}}$$

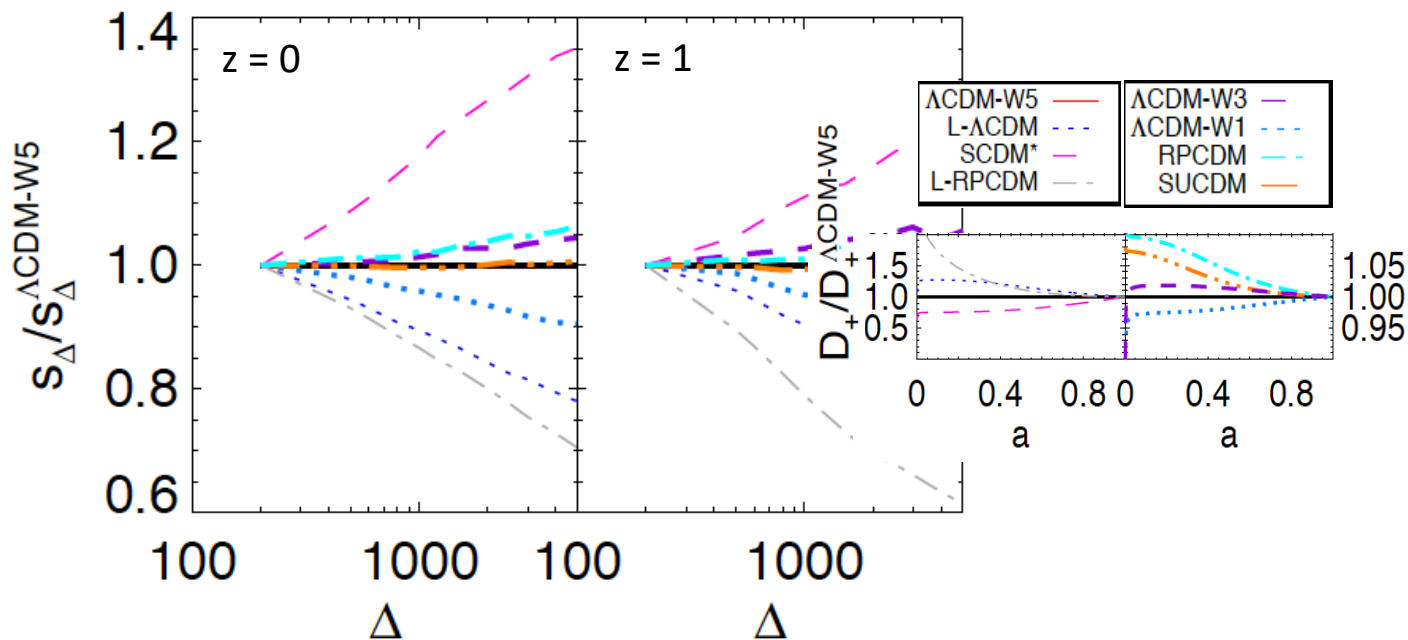
$$\tilde{t}_{LMM} = 2.14 \pm_{0.2}^{0.08} \text{ Gyr (LCDM)}$$



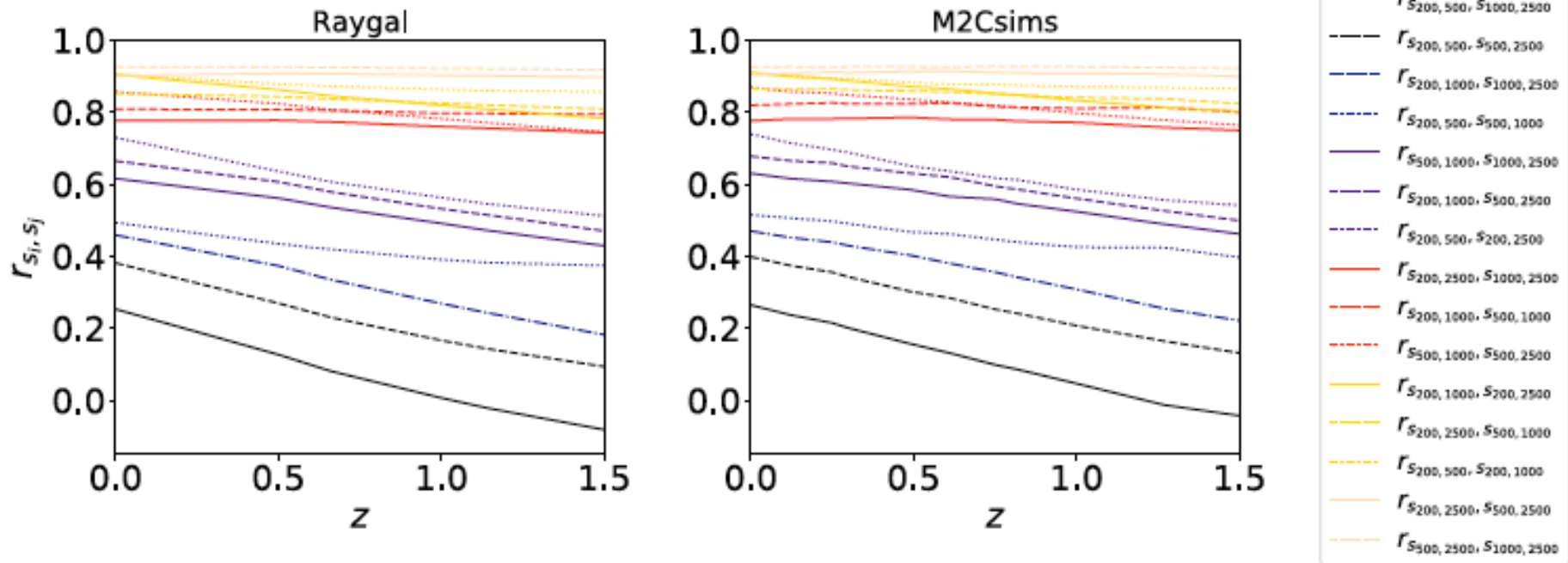
# Cosmological Imprint

## Average Sparsity

- Cosmological signal increases for  $\Delta_2 \gg \Delta_1$
- Sparsity evolution correlates with linear growth history
- The earlier the formation of structures the smaller the sparsity

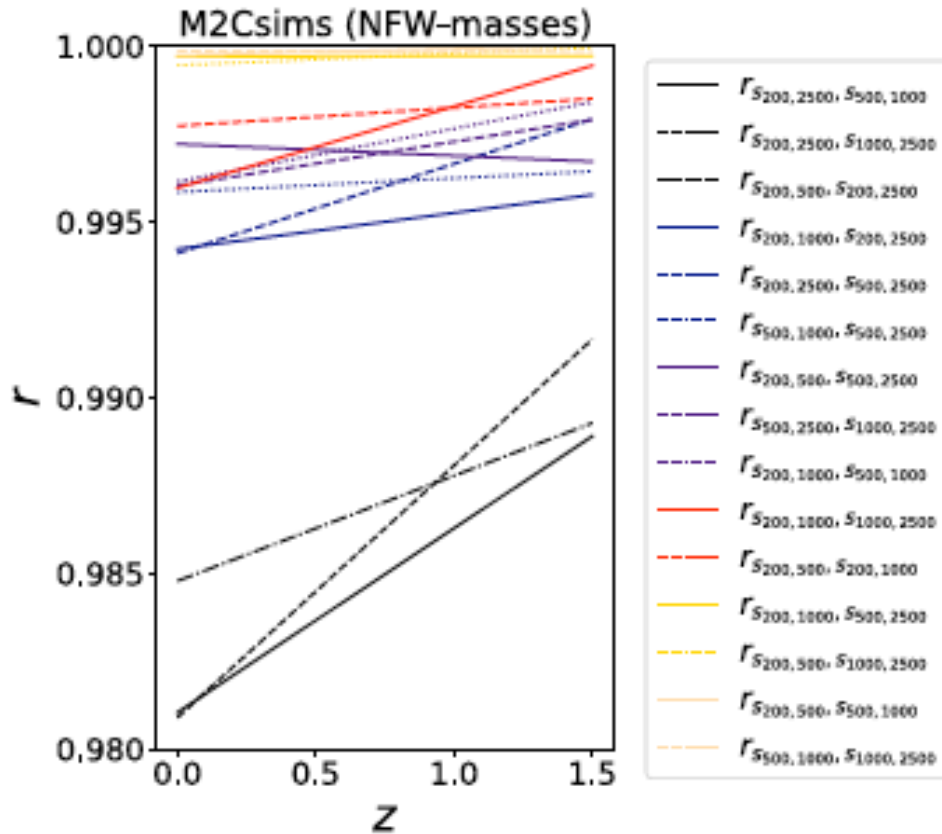


# Sparsity Correlations



- Correlations increases at lower redshift (consistent with halo mass assembly process)
- Sparsities probing distant halo shells have low correlations (inner vs outer region)
- Expected from mass accretion history (inner region contains mass from major merger events, outer from minor and diffuse matter accretion)

# NFW-induced Correlations



Corasaniti, Le Brun, Richardson et al. (2022)

- Best-fit M2Csims halos at given  $z$  with NFW
- Estimate corresponding sparsities halo by halo
- Compute correlations among NFW halo sparsities at given redshift

## Results

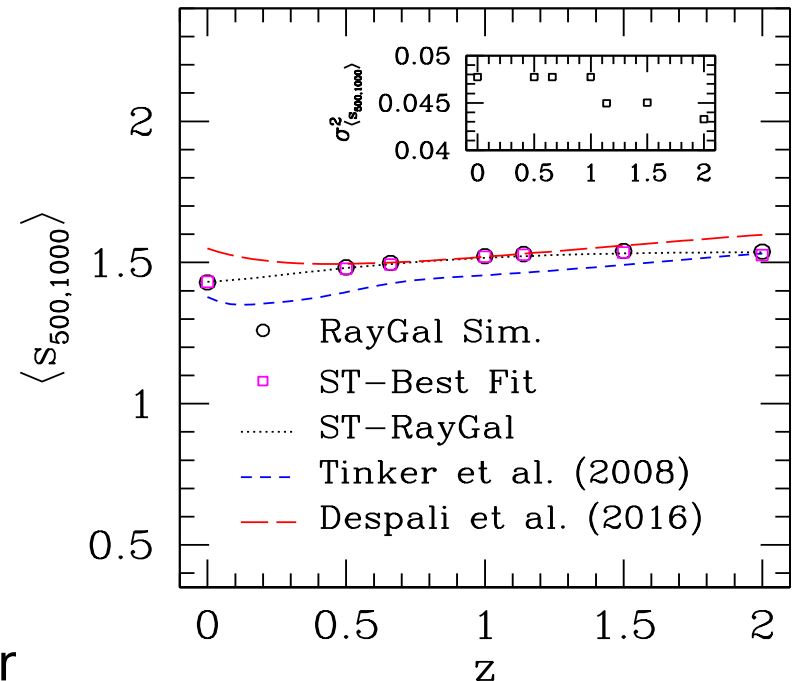
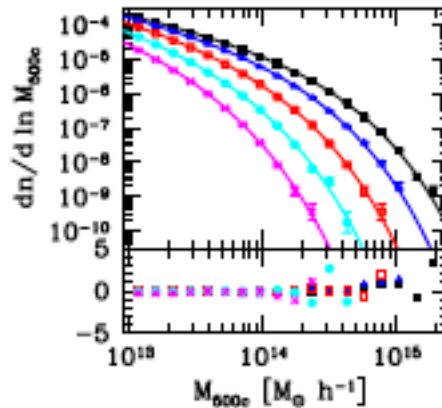
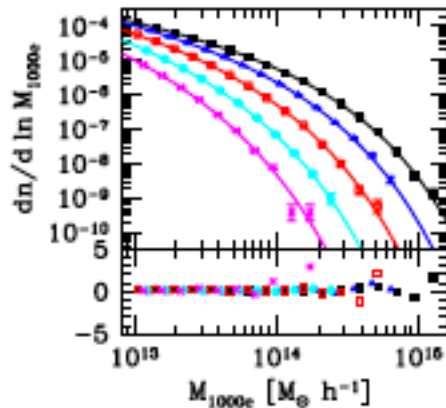
- Assuming NFW destroys all information encoded in different halo mass shells
- Impose Spurious Correlations:  $r \sim 1$
- There is more information on the halo mass profile than encoded in the NFW profile

# Average Halo Sparsity

## Sparsity – Mass Function Relation

$$\frac{dn}{dM_{\Delta_2}} = S_{\Delta_1\Delta_2} \frac{dn}{dM_1} \frac{d\log M_1}{d\log M_{\Delta_2}} \rightarrow \int_{M_{\Delta_2}^{\min}}^{M_{\Delta_2}^{\max}} \frac{dn}{dM_{\Delta_2}} d\ln M_{\Delta_2} = \langle s_{\Delta_1, \Delta_2} \rangle \int_{\langle s_{\Delta_1, \Delta_2} \rangle M_{\Delta_2}^{\min}}^{\langle s_{\Delta_1, \Delta_2} \rangle M_{\Delta_2}^{\max}} \frac{dn}{dM_{\Delta_1}} d\ln M_{\Delta_1}$$

- N-body Calibrated Halo Mass Functions at  $\Delta_1$  and  $\Delta_2$



- Accurate to sub-percent level
- Quantitative Framework for Cosmological Model Predictor



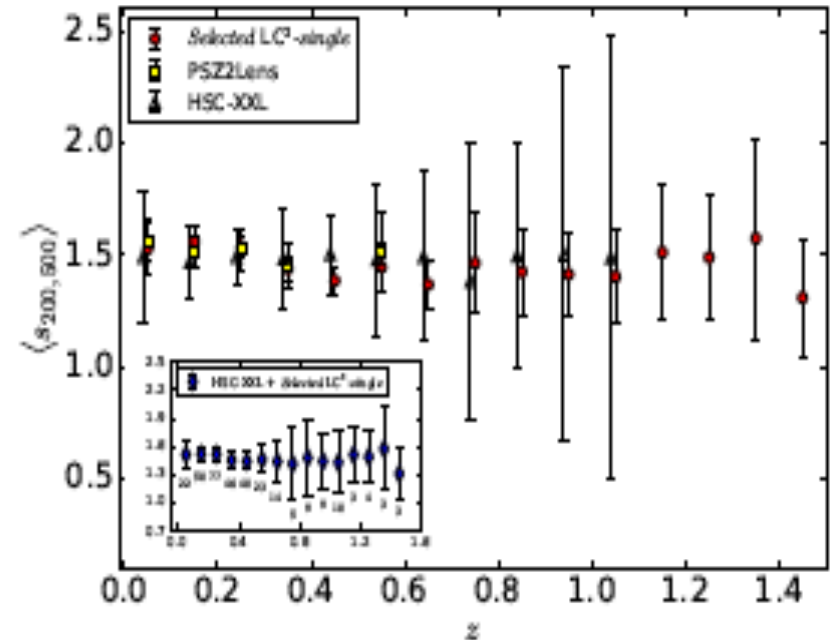
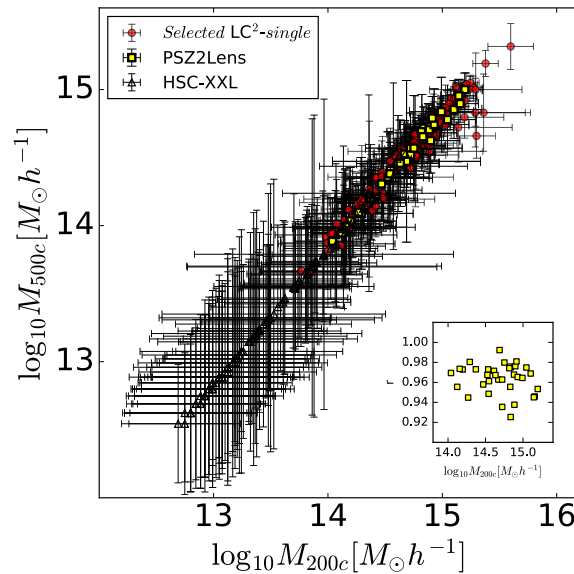
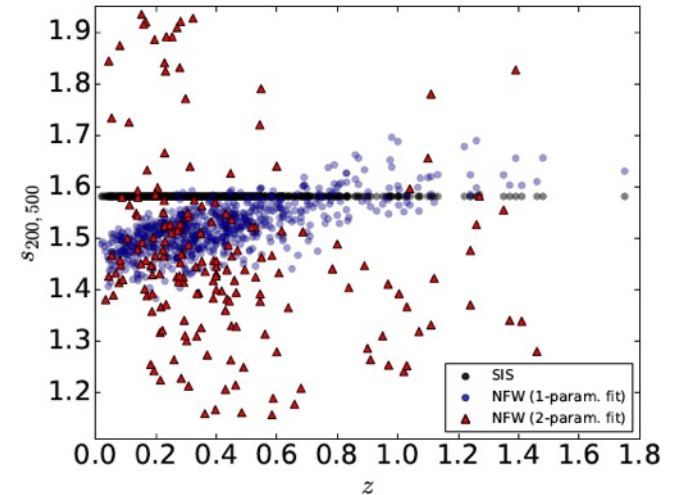
# Cosmological Parameter Analysis

## Weak Lensing Cluster Masses

- LC<sup>2</sup> catalog (672 clusters,  $z < 1.7$ )  
Sereno (2015)
- Removing Biased Estimates

## Sparsity Cosmological Sample

- Selected LC<sup>2</sup>-single (317  $\supset$  PSZ2Lens) + HSC-XXL (136,  $z < 1.03$ )
- $0 < z < 1.5$ ;  $M_{200c} > 10^{13} M_{\text{sun}} h^{-1}$



# MCMC - Sparsity + BAO

## Model Parameters & Priors

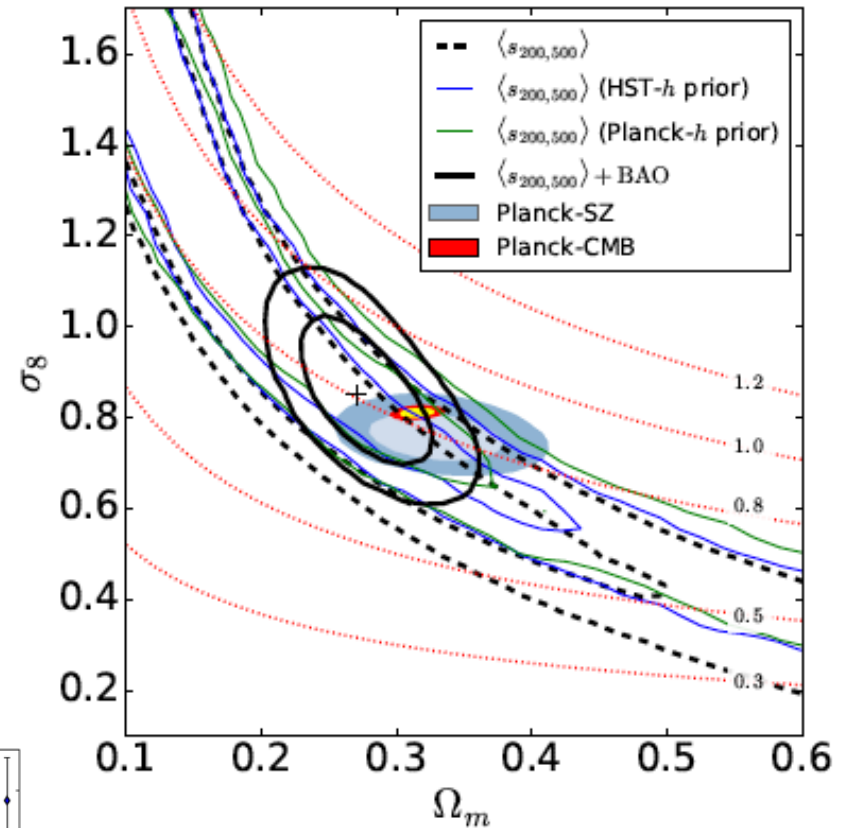
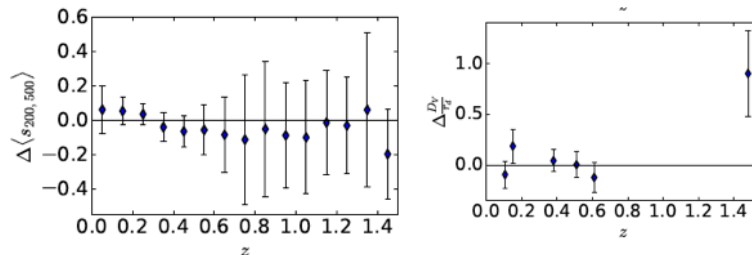
- $\Omega_m$ ,  $\sigma_8$ ,  $h$  (+  $n_s$ -Planck prior &  $\Omega_b h^2$ -BBN prior)
- $S_8$  degeneracy
  - $S_8 = 0.75 \pm 0.20$
  - $S_8 = 0.80 \pm 0.18$  (HST-prior)
  - $S_8 = 0.82 \pm 0.16$  (Planck h-prior)

## Pre-reconstruction BAO Data

- Marginal Stats:

$$\begin{aligned}\Omega_m &= 0.28 \pm 0.03 \\ \sigma_8 &= 0.86 \pm 0.10 \\ h &= 0.66 \pm 0.02\end{aligned}$$

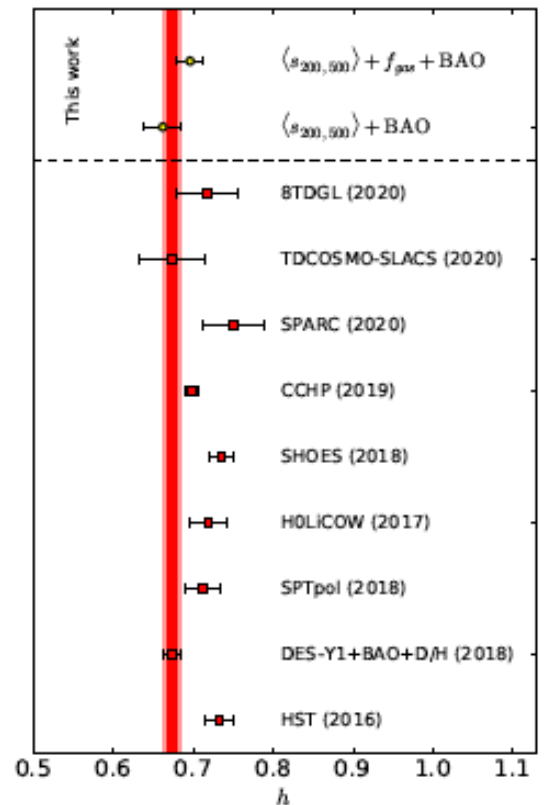
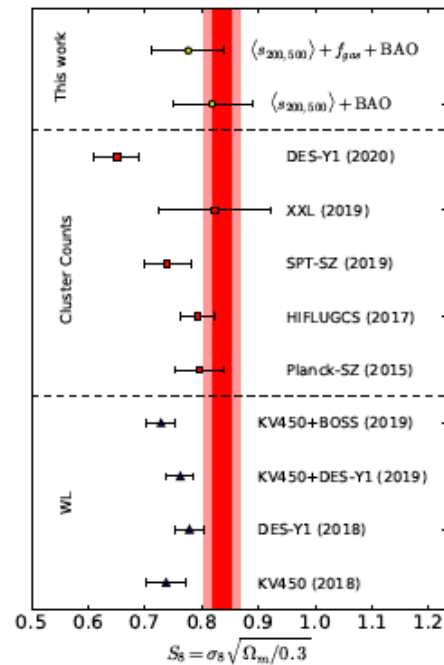
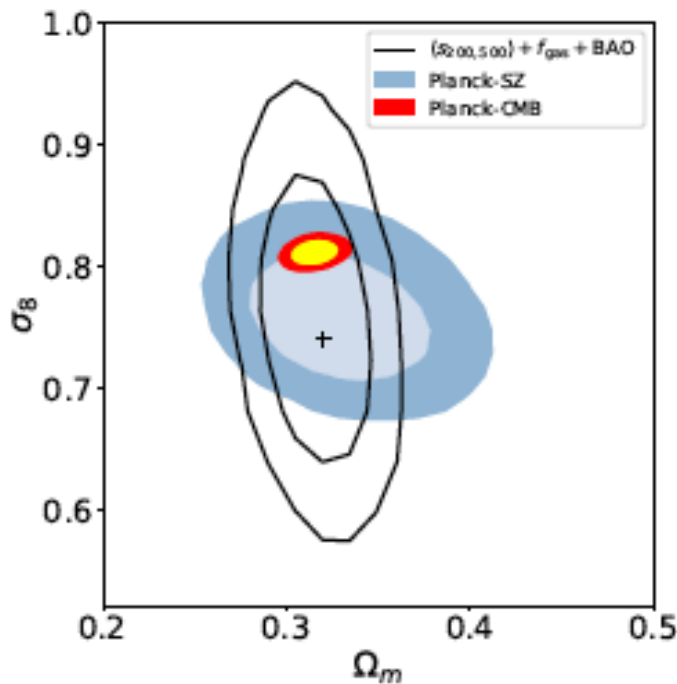
- Residuals



# MCMC – Sparsity + $f_{\text{gas}}$ + BAO

## Joint Analysis

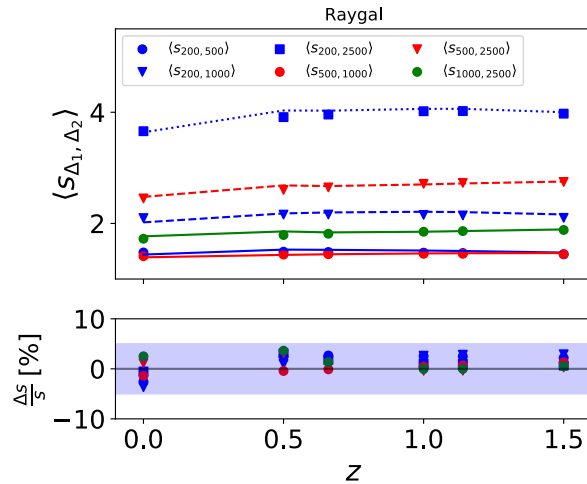
- Marginalized on  $f_{\text{gas}}$  parameters (K &  $Y_b$ )
- $\Omega_m = 0.32 \pm 0.02$ ;  $\sigma_8 = 0.76 \pm 0.07$ ;  $h = 0.70 \pm 0.02$



- Assuming  $K_{\text{CLASH}} \sim G(0.79, 0.09) \rightarrow Y_b > 0.89$

# Multiple Sparsity Measurements

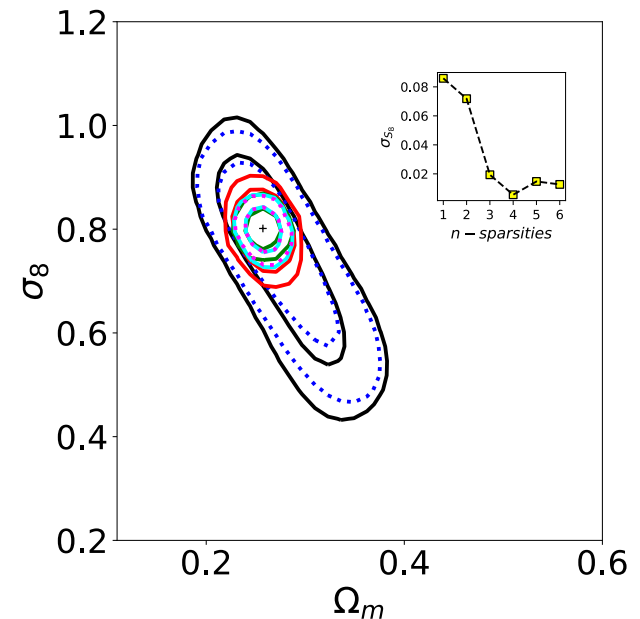
## Non-Parametric Cluster Mass Estimates



- Mass Estimates  $\Delta = 200, 500, 1000, 2500$
- $N_s = 6$  sparsities
- Correlations + Propagation of theoretical model errors

## MCMC Analysis

- Additional sparsities break  $S_8$  degeneracy
- Constraints saturate at  $N_s = 4$
- Practically requires mass measurements beyond 2-parameter profile fit

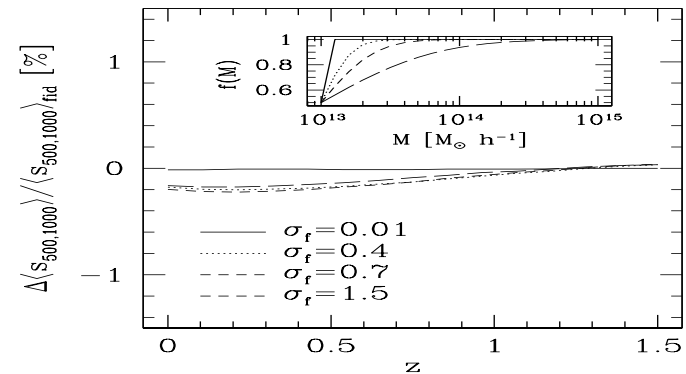


# Sparsity Systematic Effects

## Selection Effects

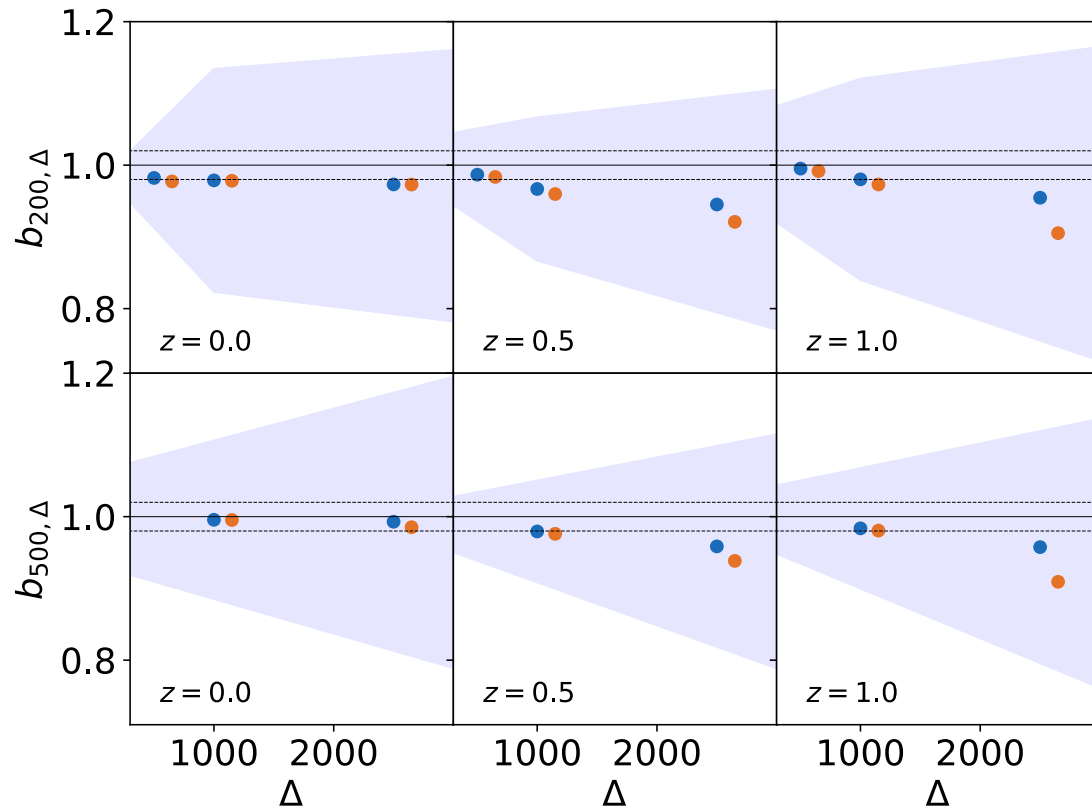
- Sub-percent level
- Consistent with near constant sparsity – mass relation

Corasaniti et al. (2018)



## Radial Dependent Mass Bias

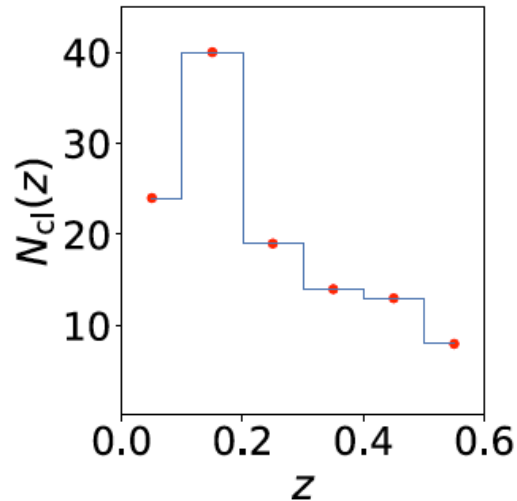
- Preliminary analysis of The300
- $< 1\text{-}2\%$  at  $z = 0$
- Increases at  $z > 0$  and larger overdensities
- Baryons induce correlations in the inner halo region





# Impact on Cosmological Inference

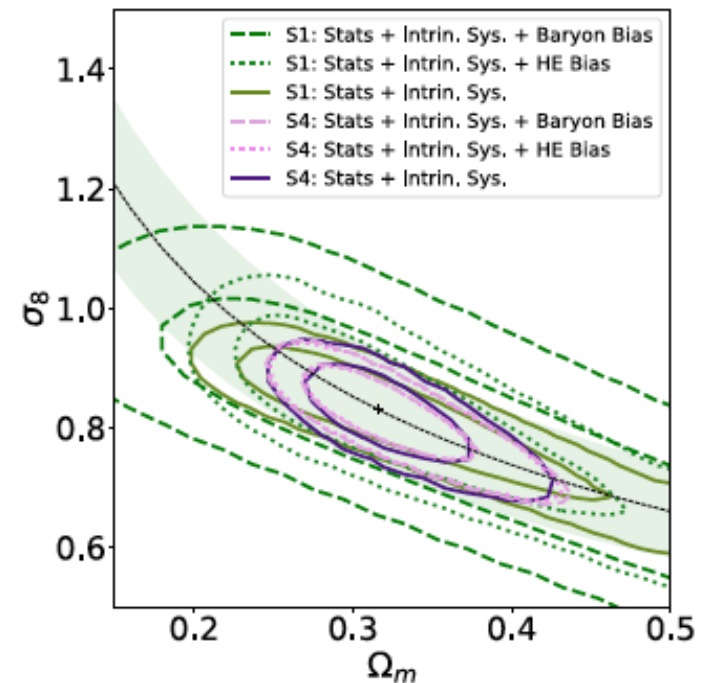
## CHEXMATE-like Sample



- 118 Clusters in  $0 < z < 0.6$
- $e_{M\Delta} = 0.23, 0.15, 0.11$  &  $0.10$  (for  $\Delta = 200, 500, 1000$  &  $2500$ )
- Propagate radial mass bias & HE bias
- Single vs Multiple ( $n=4$ ) sparsities

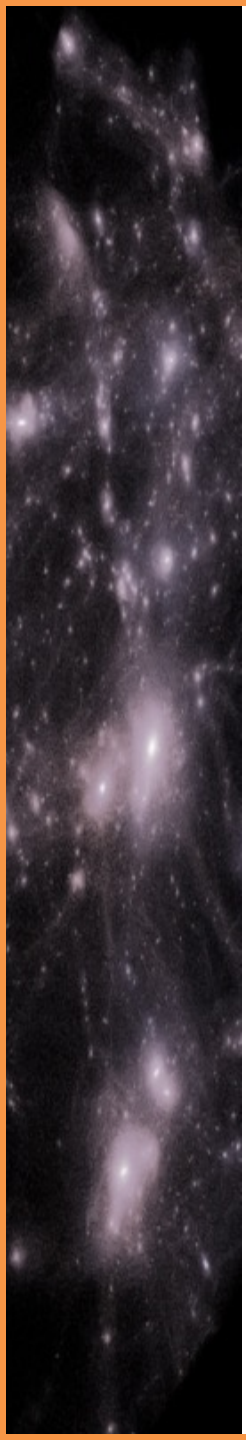
## MCMC Constraints

- Significant Effect on Single Sparsity inferred constraints
- Negligible Effect on Multiple Sparsity case
- $\sim$  percent level errors on  $\Omega_m$  and  $\sigma_8$



# Conclusions

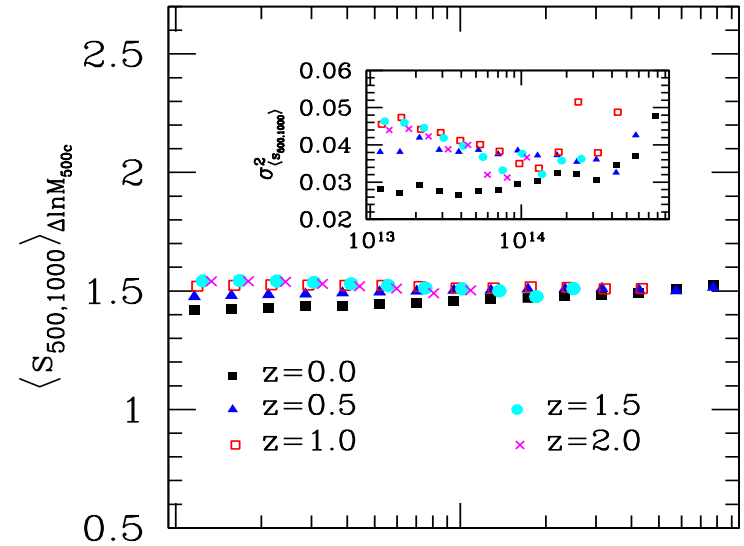
- Non-parametric Probe of Halo Mass Assembly History
- Capture Information Beyond Concentration Parameter
- Minimal Systematics
- Observational Proxy of Cluster Cosmology and Astrophysics



# Sparsity Ensemble Properties

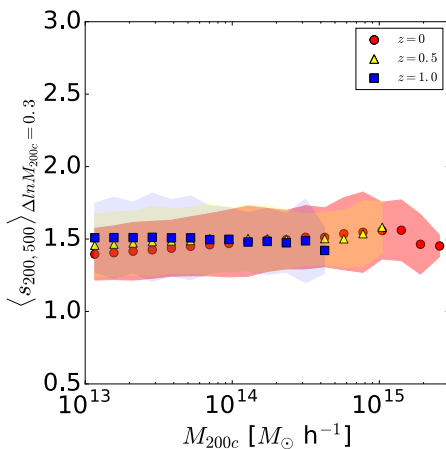
## RayGalGroupSims Analysis

- $L_{\text{box}} = 2.6 \text{ Gpc}/h$ ;  $N_p = 4096^3$
- SOD Halos ( $M_{200c} > 10^{13} M_{\text{sun}}/h$ )
- Nearly constant (<10% variation across 2 orders in mass)
- Intrinsic scatter bounded to  $\sim 20\%$
- Trend independent of  $\Delta_1$  and  $\Delta_2$



Corasaniti et al. (2018)

## MultiDark-Planck2 Analysis



- $L_{\text{box}} = 1 \text{ Gpc}/h$ ;  
 $N_p = 3840^3$
- SOD Halos  
( $M_{200c} > 10^{13}$   
 $M_{\text{sun}}/h$ )

Corasaniti & Rasera (2019)

