



# Halo Sparsity

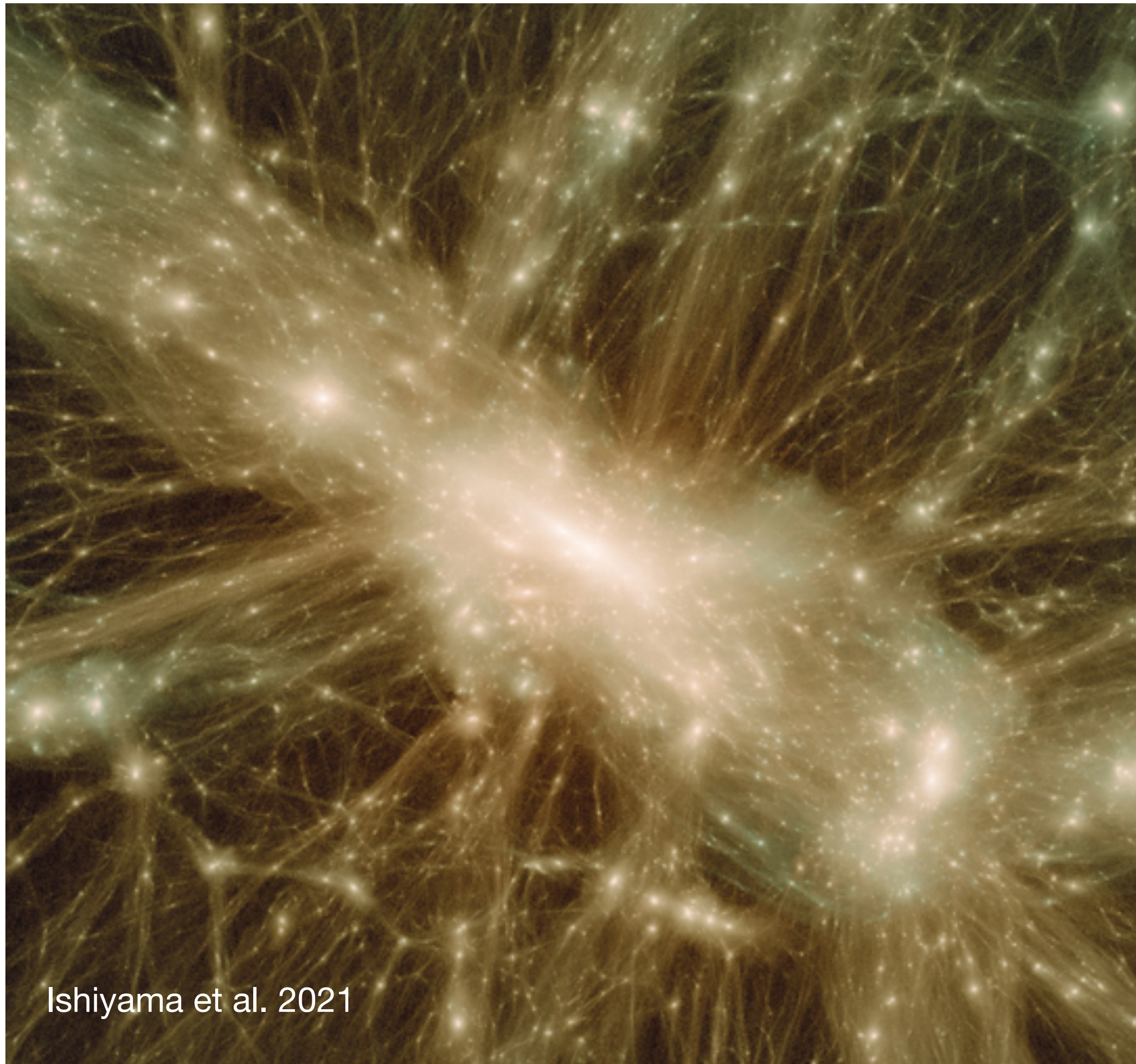
**A Swiss army knife for  
galaxy cluster astrophysics  
and cosmology**

# Outline



- What is Sparsity?
- Cluster Mergers
- The Halo Mass Function
- Cosmology

# What are haloes?



Ishiyama et al. 2021

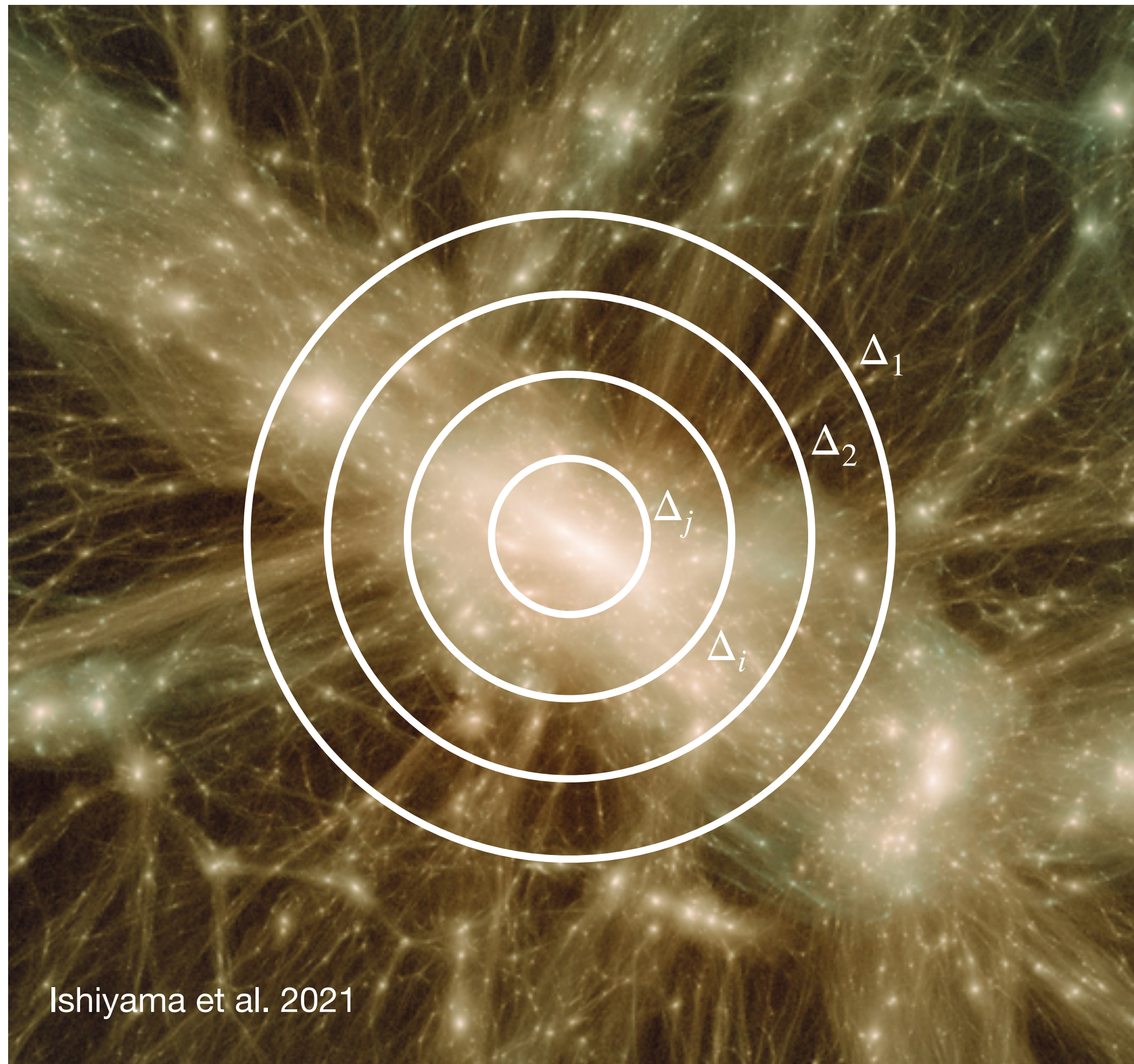
Product of **cosmological** structure formation.

Hosts of galaxies, galaxy clusters and their **astrophysical** processes.

Imprint on the internal structure of haloes?

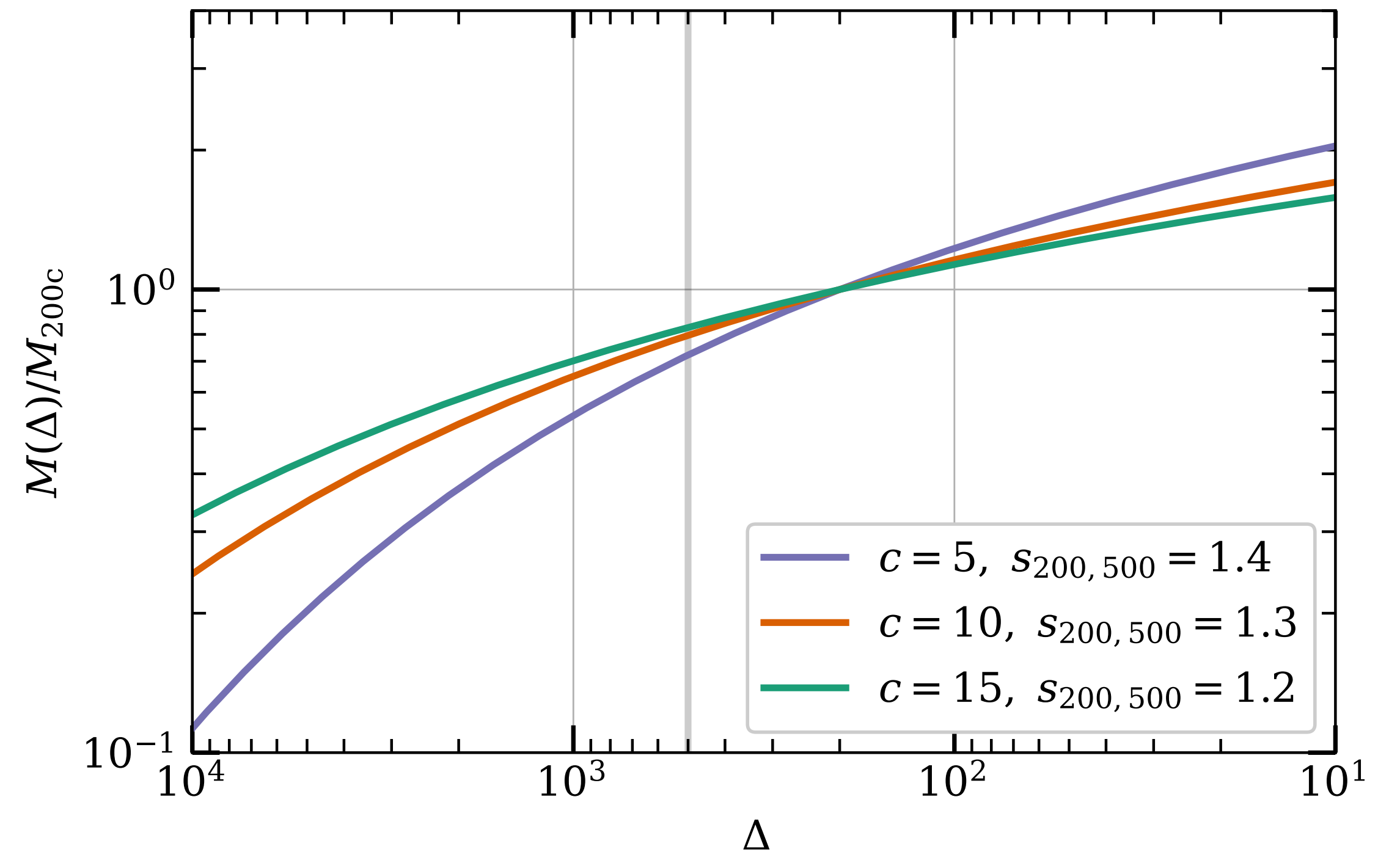
What can it tell us about the Universe?

# What is Halo Sparsity?

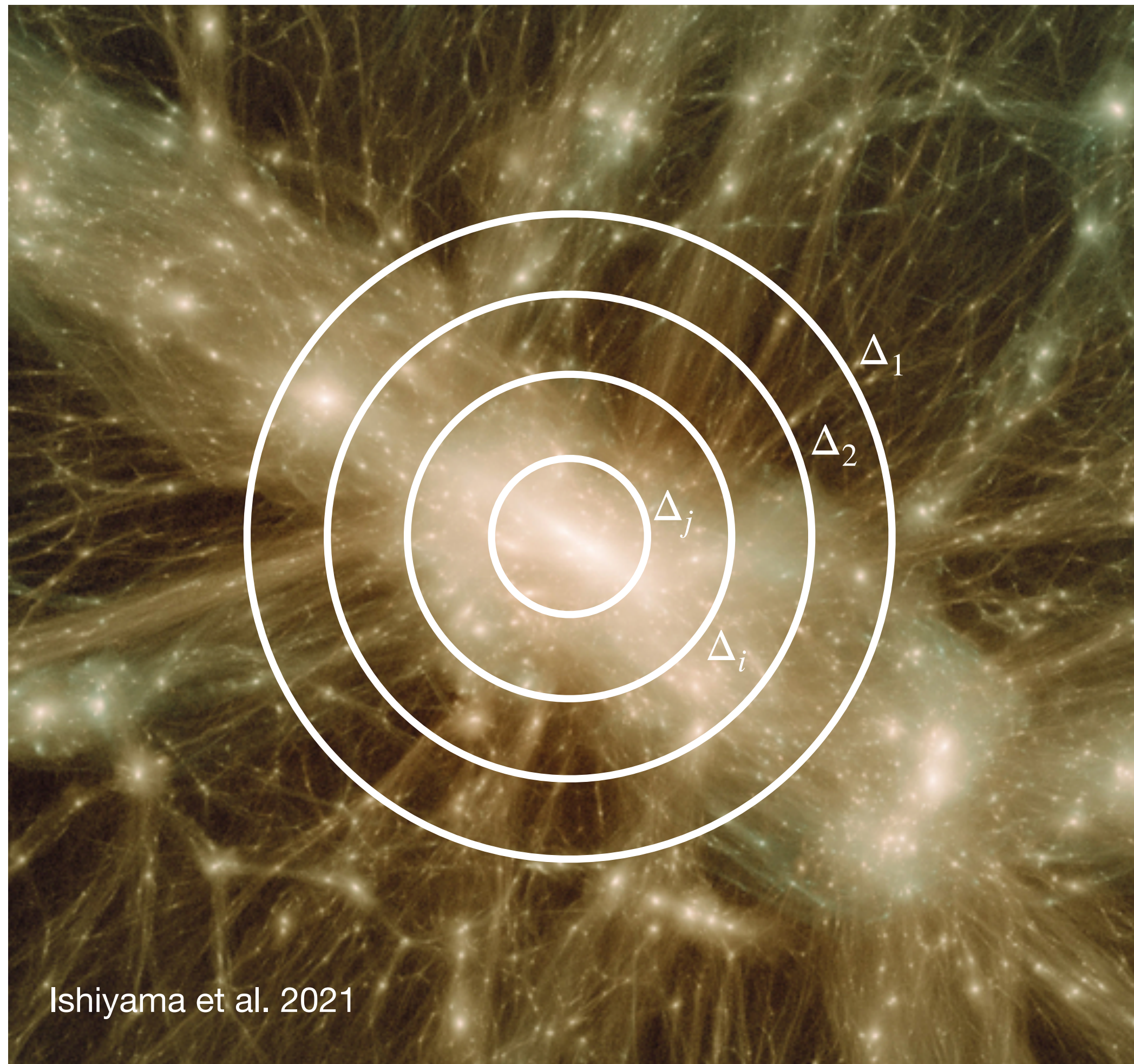


$$s_{\Delta_1, \Delta_2} = \frac{M_{\Delta_1}}{M_{\Delta_2}}$$

Non - Parametric  
Astrophysics  
Cosmology

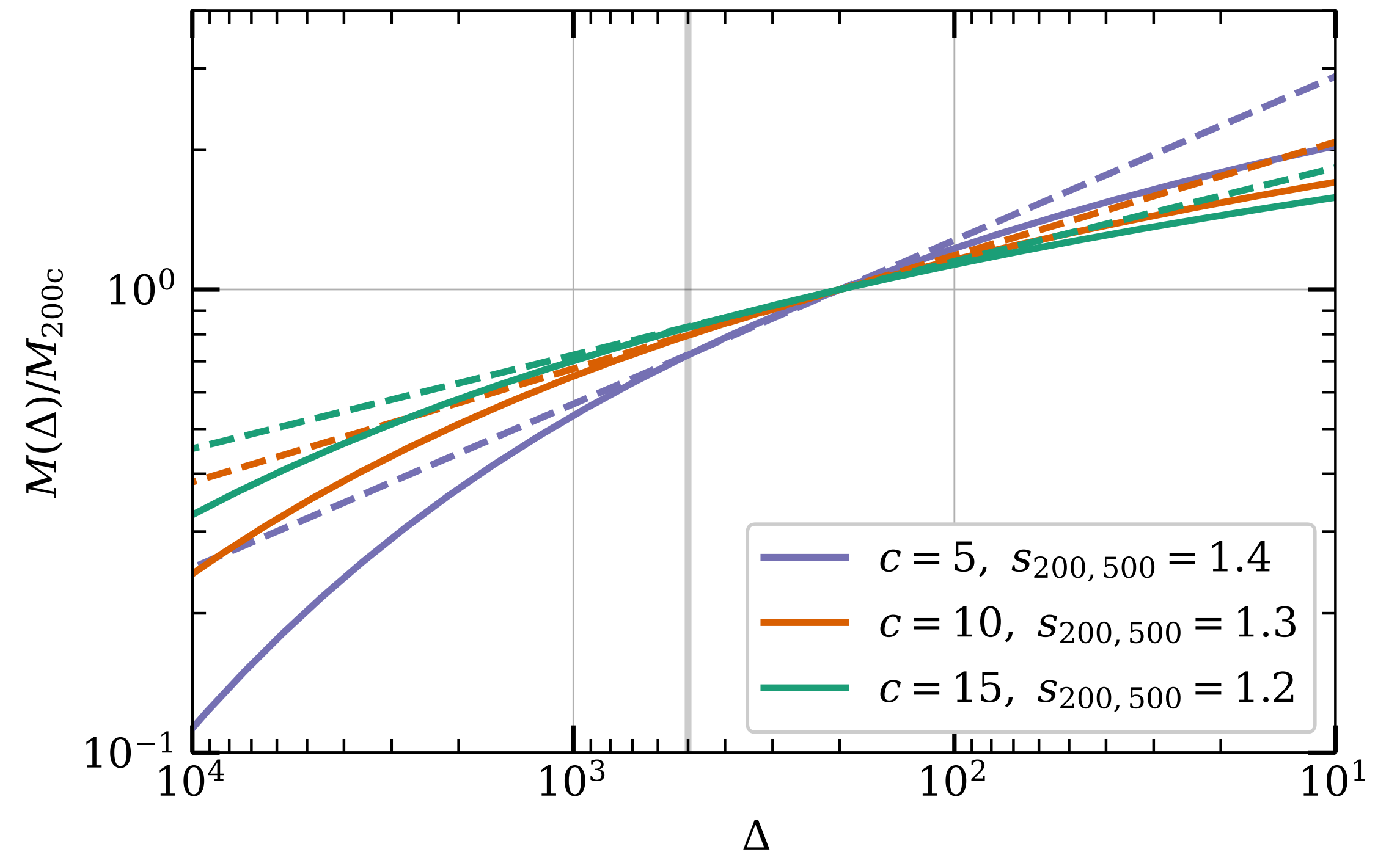


# What is Halo Sparsity?



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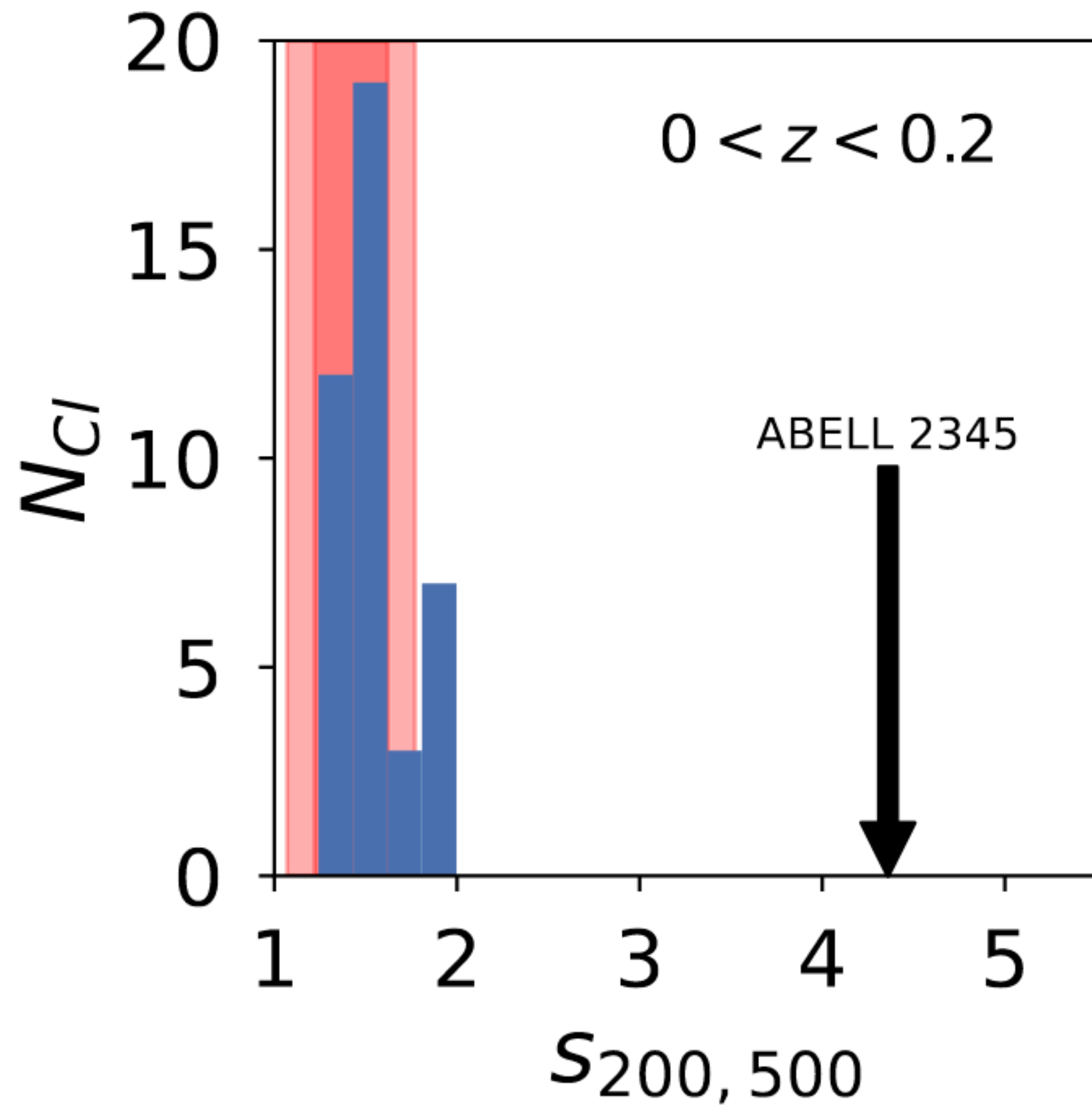
Non - Parametric  
Astrophysics  
Cosmology



# Major Mergers



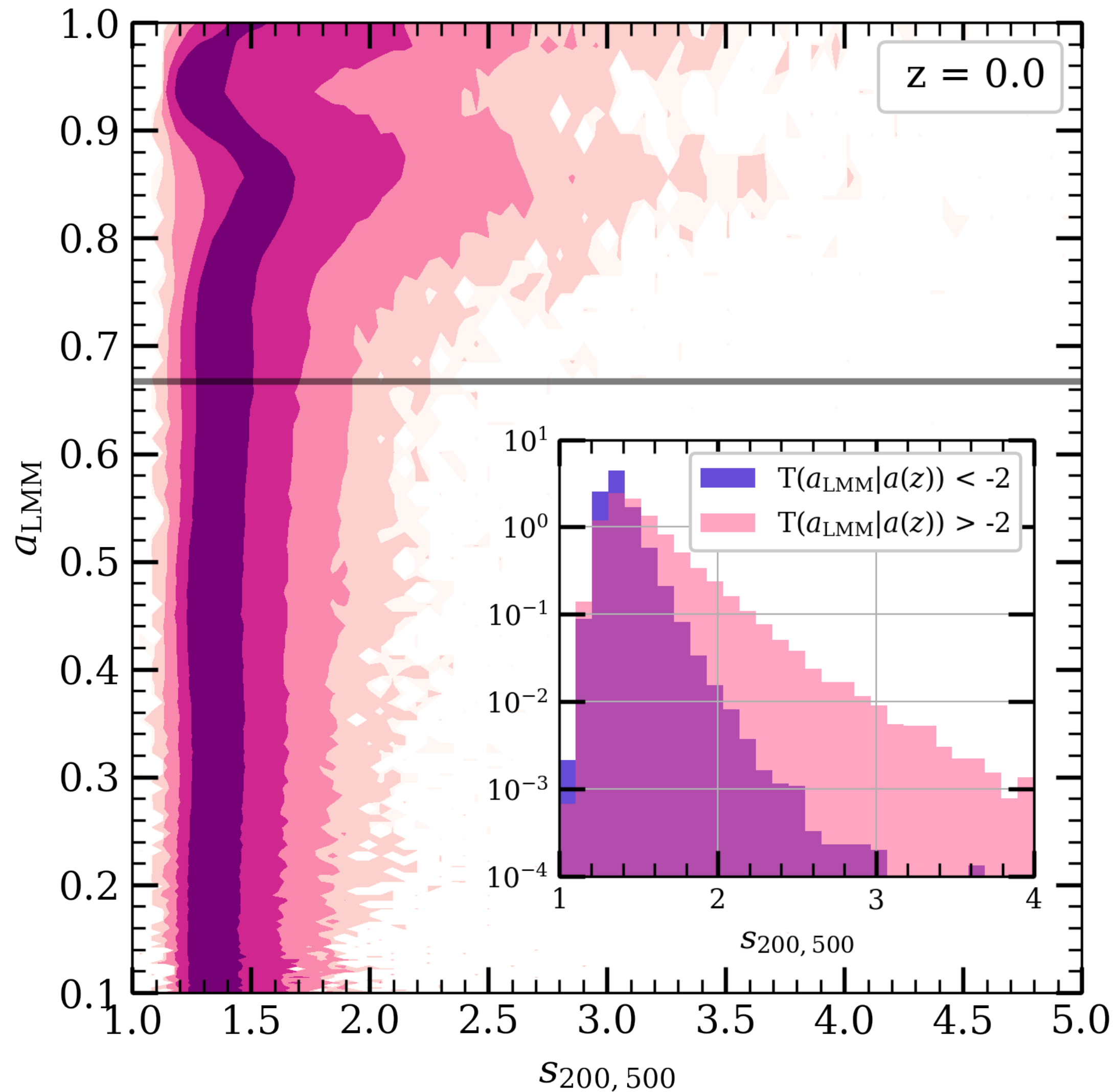
# Major Mergers



Corasaniti et al. 2021: Are clusters with **large**  $S_{\Delta_1, \Delta_2}$  **merging or unrelaxed?**

Richardson & Corasaniti 2022: **Yes.**  
Sparsity reacts systematically to mergers

# Major Mergers

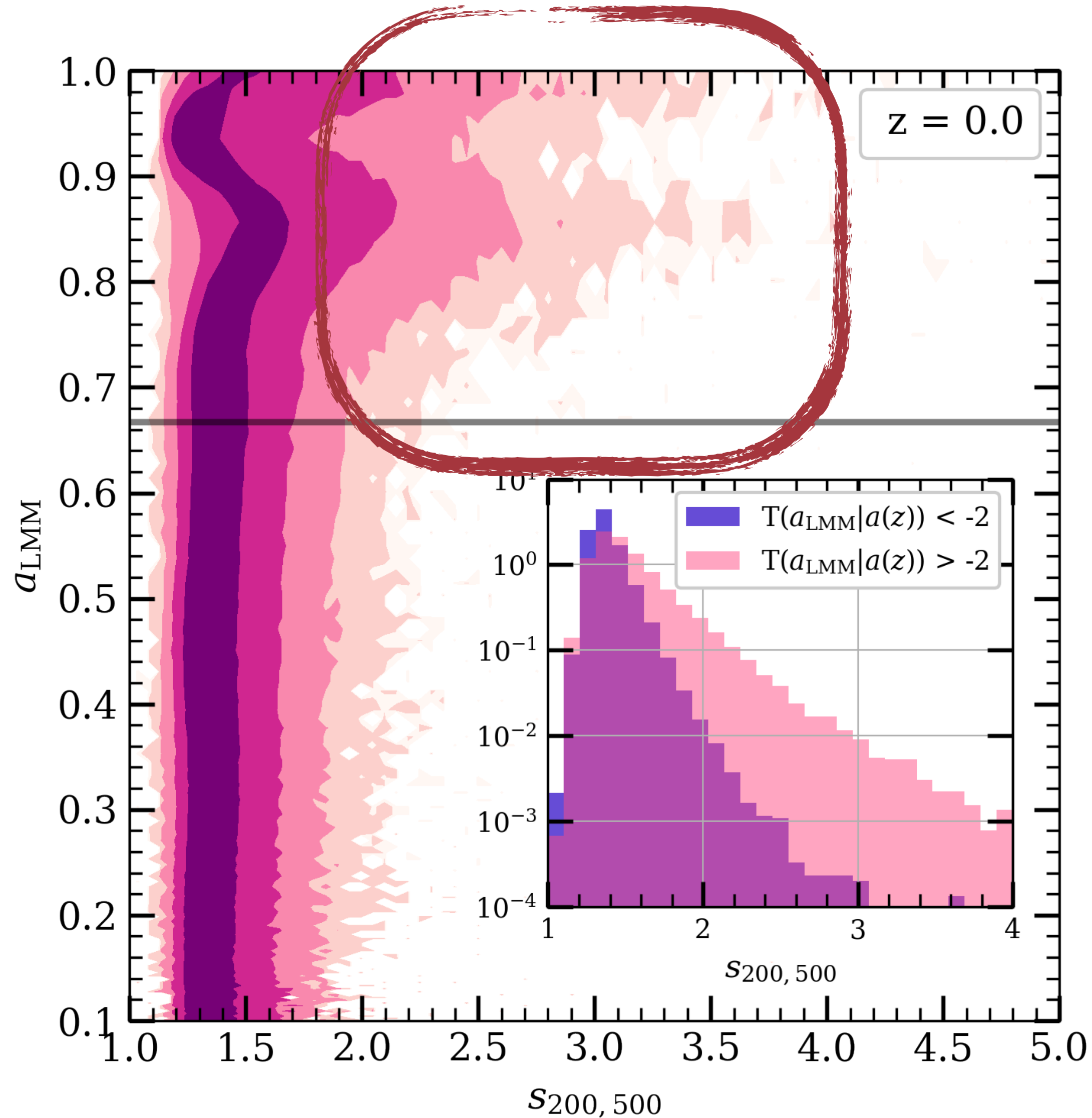


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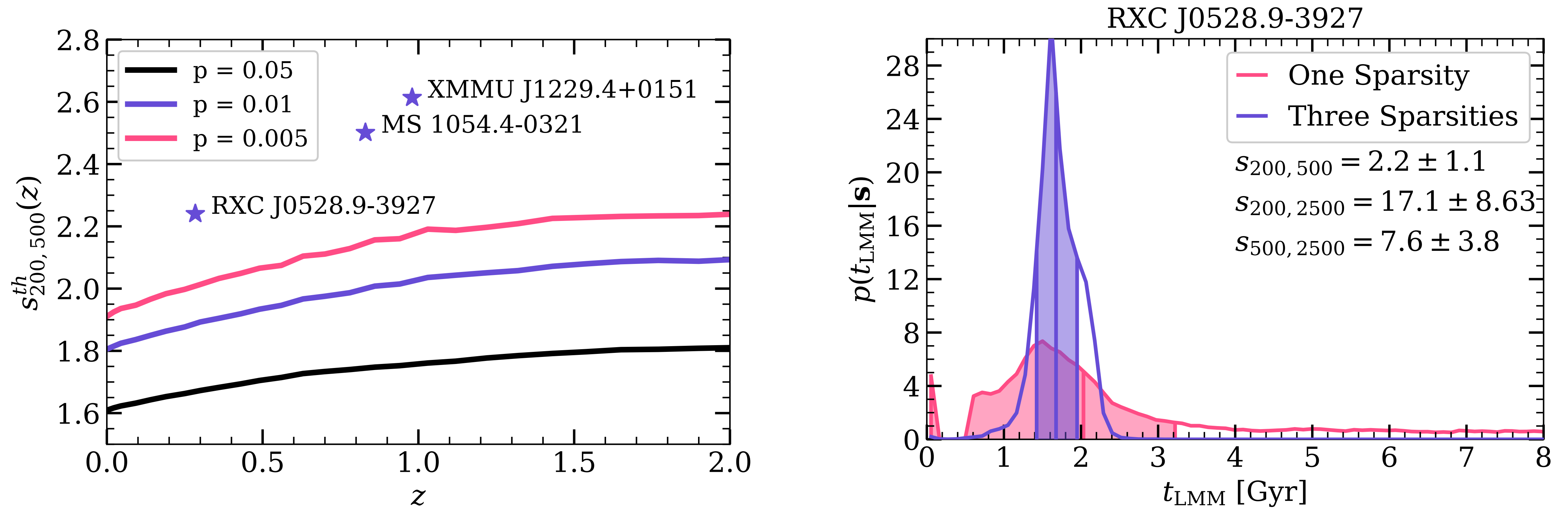


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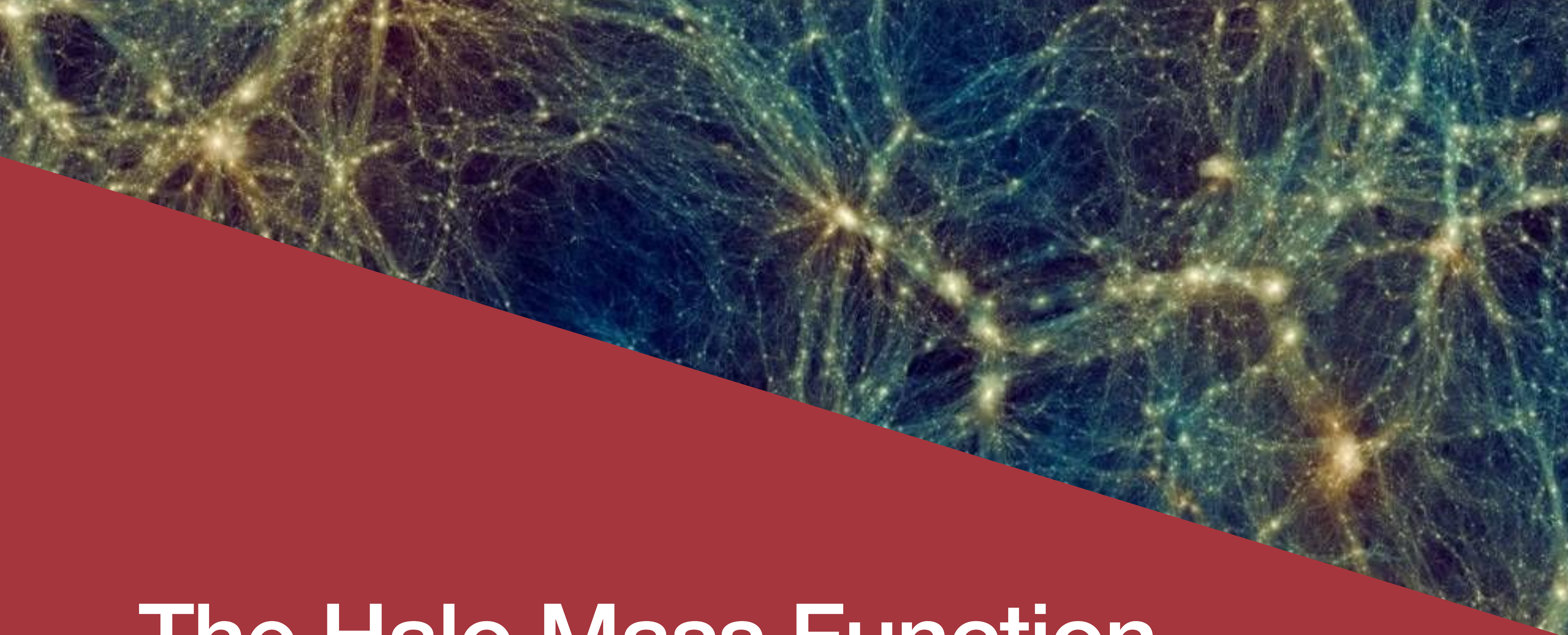
**Large sparsity is very likely to be a merger**

# Detection with sparsity



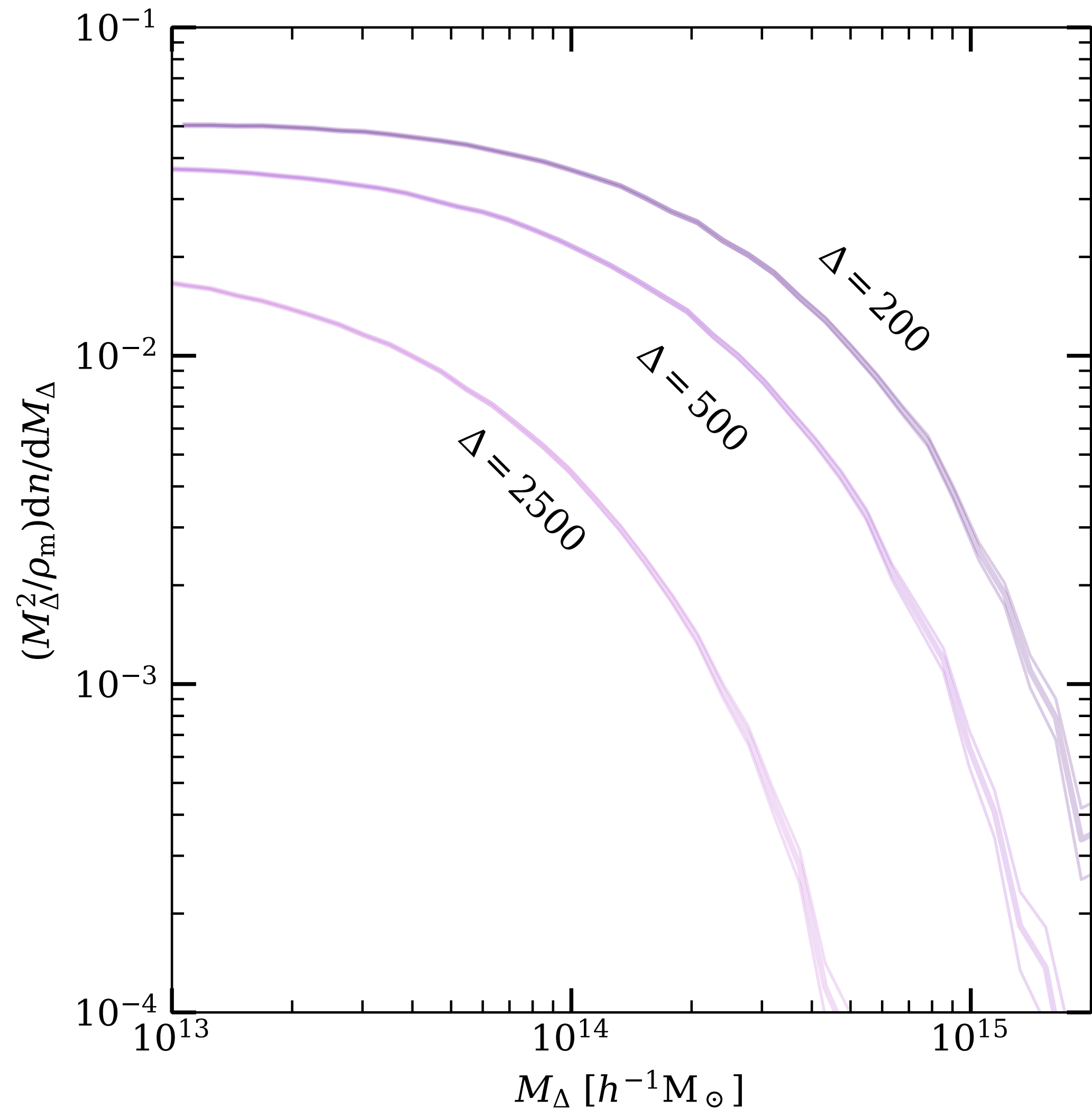
We can use the probability distribution from the simulation as a likelihood to set **thresholds** and even get a first **estimate of the merger time**.

Not super precise but can be used to **quickly** screen catalogues



# The Halo Mass Function

# The Halo Mass Function



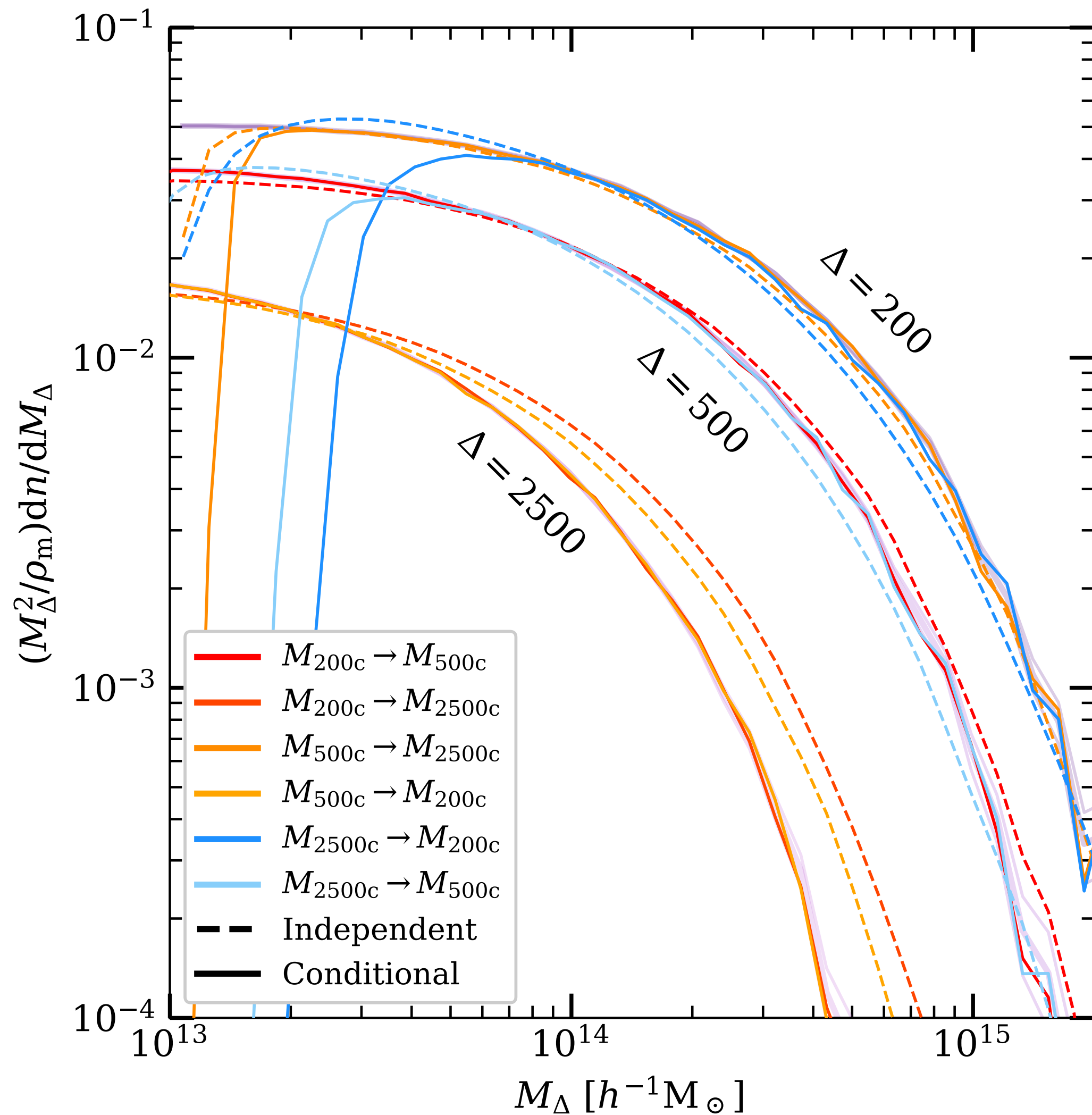
**The HMF:** How many haloes are expected per unit mass per unit volume.

**Alternate view:** The probability of finding a halo of mass  $M_\Delta \in [M, M + dM]$  in a volume  $dV$ .

$M_\Delta$  is a random variable drawn from  $\frac{dn}{dM_\Delta}$

$s_{\Delta_1, \Delta_2} = \frac{M_{\Delta_1}}{M_{\Delta_2}}$  relates **3 random variables**

# Sparsity Transformations



We can relate their distribution functions:

$$M_{\Delta_1} \sim \frac{dn}{dM_{\Delta_1}}, \quad s \sim \rho_s(s | M_{\Delta}) \quad \text{and} \quad M_{\Delta_2} \sim \frac{dn}{dM_{\Delta_2}}$$

**“Outward”**  $M_{\Delta_1} = s_{\Delta_1, \Delta_2} M_{\Delta_2}$

$$\frac{dn}{dM_{\Delta_1}}(M_{\Delta_1}) = \int_1^{\infty} \frac{1}{x} \rho_s(x | M_{\Delta_1}/x) \frac{dn}{dM_{\Delta_2}}(M_{\Delta_1}/x) dx$$

**“Inward”**  $M_{\Delta_2} = M_{\Delta_1} / s_{\Delta_1, \Delta_2}$

$$\frac{dn}{dM_{\Delta_2}}(M_{\Delta_2}) = \int_1^{\infty} x \rho_s(x | xM_{\Delta_2}) \frac{dn}{dM_{\Delta_1}}(xM_{\Delta_2}) dx$$

# Recovering the literature

By assuming:  $\rho(s_{\Delta_1, \Delta_2} | M_{\Delta_1}) = \delta_D(s_{\Delta_1, \Delta_2} - \langle s_{\Delta_1, \Delta_2} \rangle)$

$$\frac{dn}{dM_{\Delta_2}} = \left[ \frac{\bar{\rho}_m}{M_{\Delta_2}} \frac{d \ln \sigma^{-1}}{dM_{\Delta_2}} f(\sigma) \right] \frac{1}{\langle s_{\Delta_1, \Delta_2} \rangle} \quad \left| \quad \frac{dn}{dM_{\Delta_2}} = \left[ \frac{\bar{\rho}_m}{M_{\Delta_2}} \frac{d \ln \sigma^{-1}}{dM_{\Delta_2}} f(\sigma) \right] \frac{M_{\Delta_2}}{M_{\Delta_1}}$$

Richardson & Corasaniti *in prep.*

Bocquet et al. 2016  
Ragagnin et al. 2021

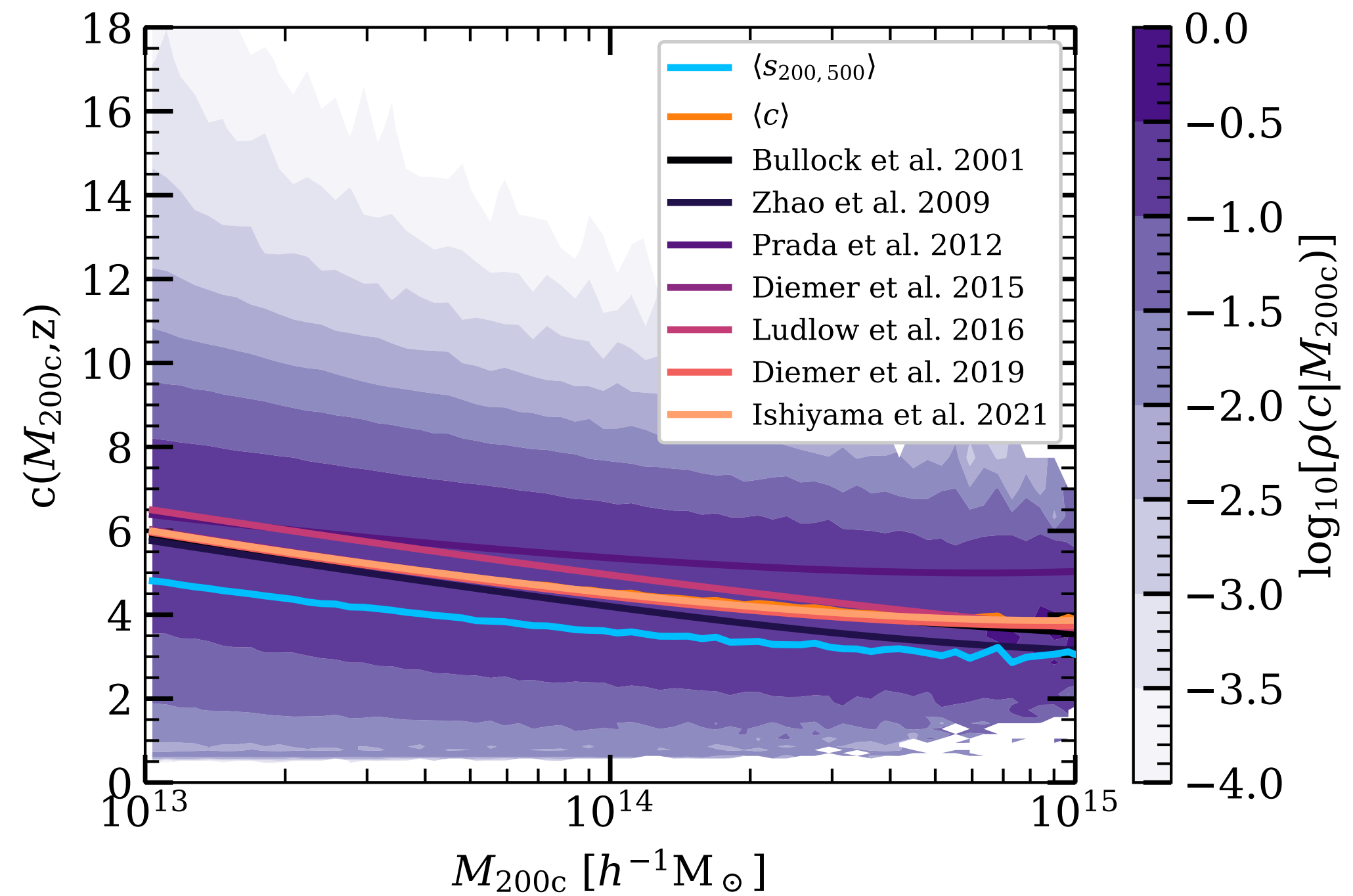
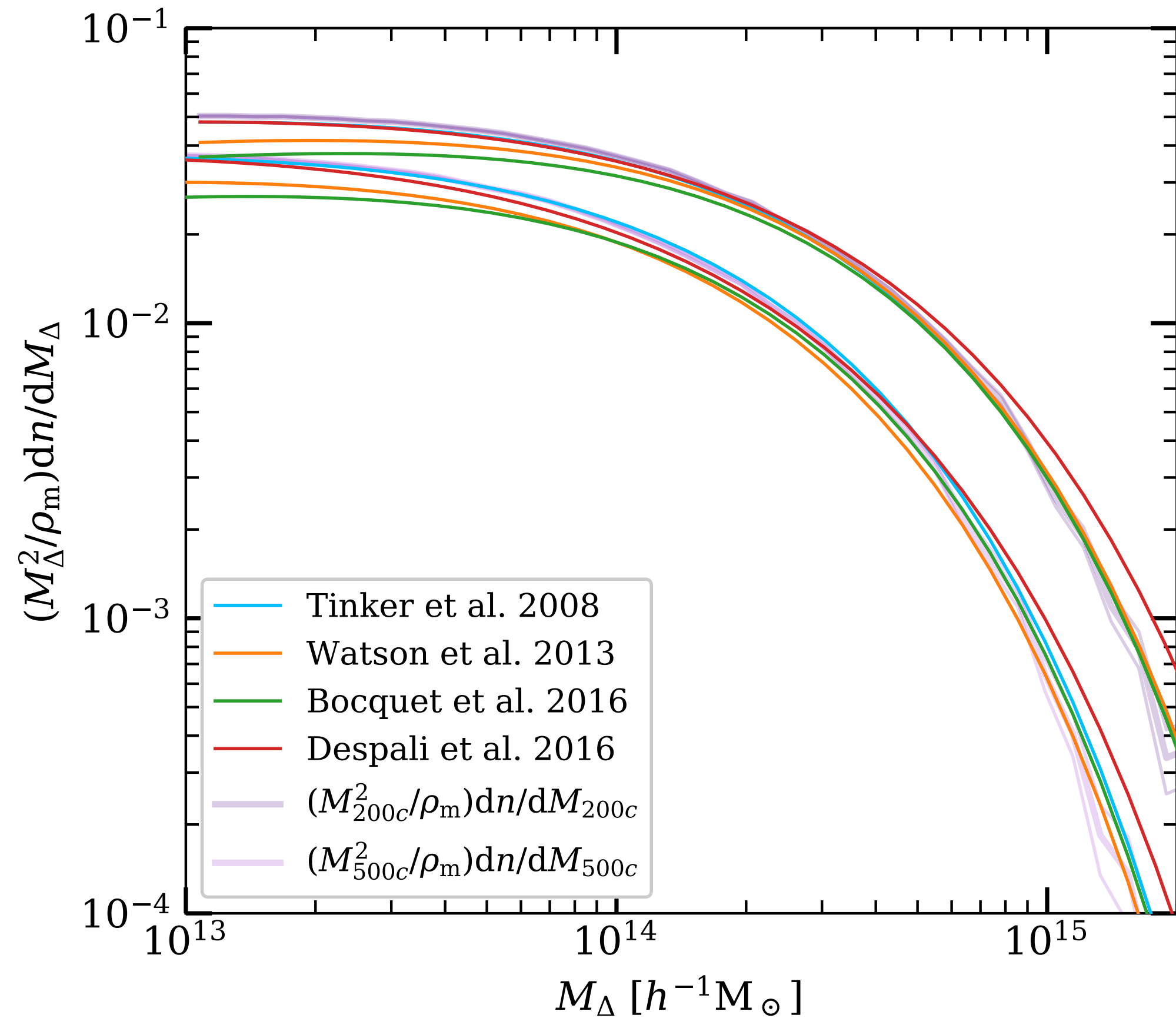
A second result from Balmès et al. 2014 can be recovered by integrating over  $M_{\Delta_2}$  with the same assumption.

$$\int \frac{dn}{dM_{\Delta_2}} d \ln M_{\Delta_2} = \langle s_{\Delta_1, \Delta_2} \rangle \int \frac{dn}{dM_{\Delta_1}} d \ln M_{\Delta_1}$$

Foundational equation for sparsity constraints

Corasaniti et al. 2018, 2021, 2022

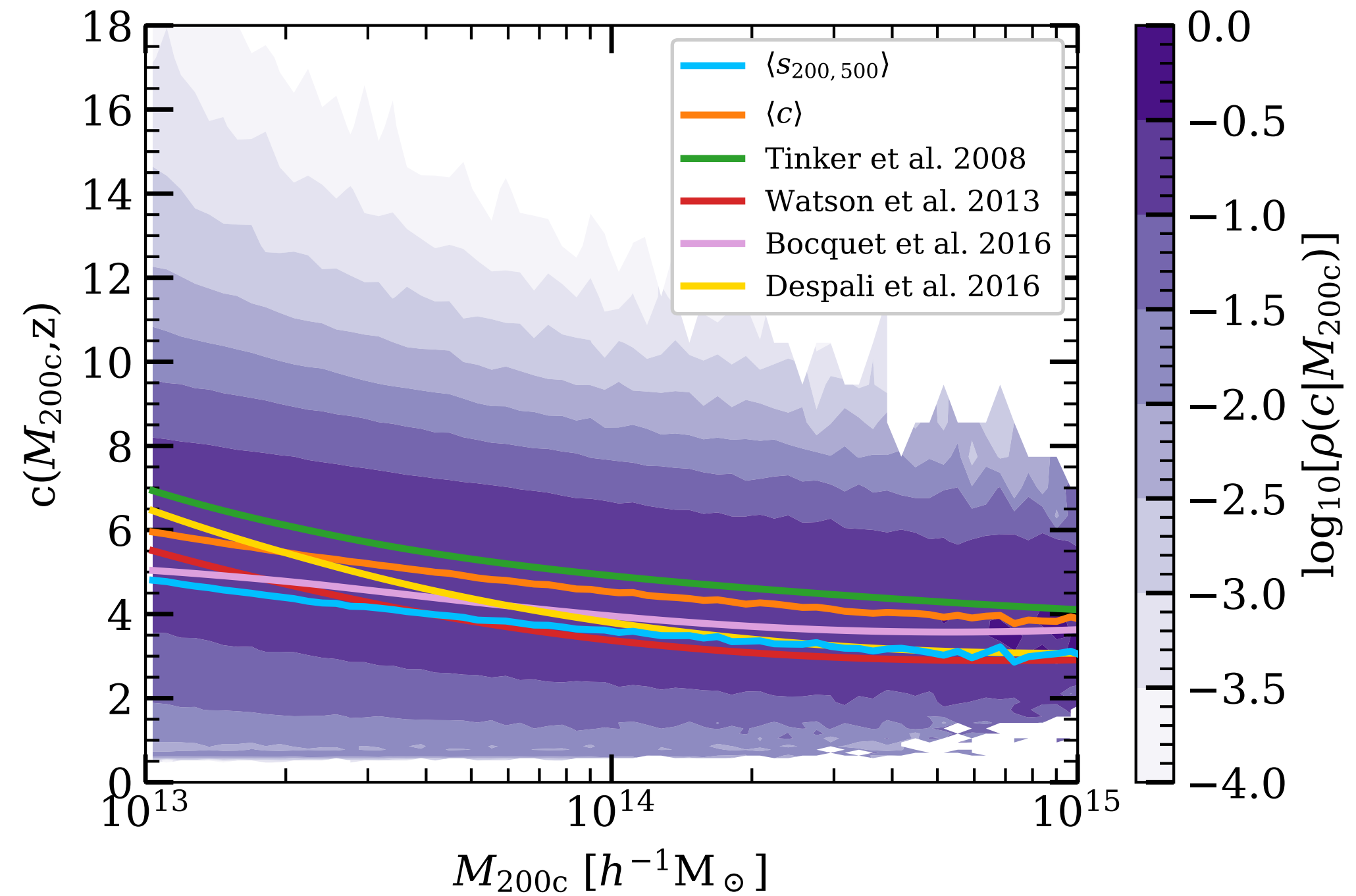
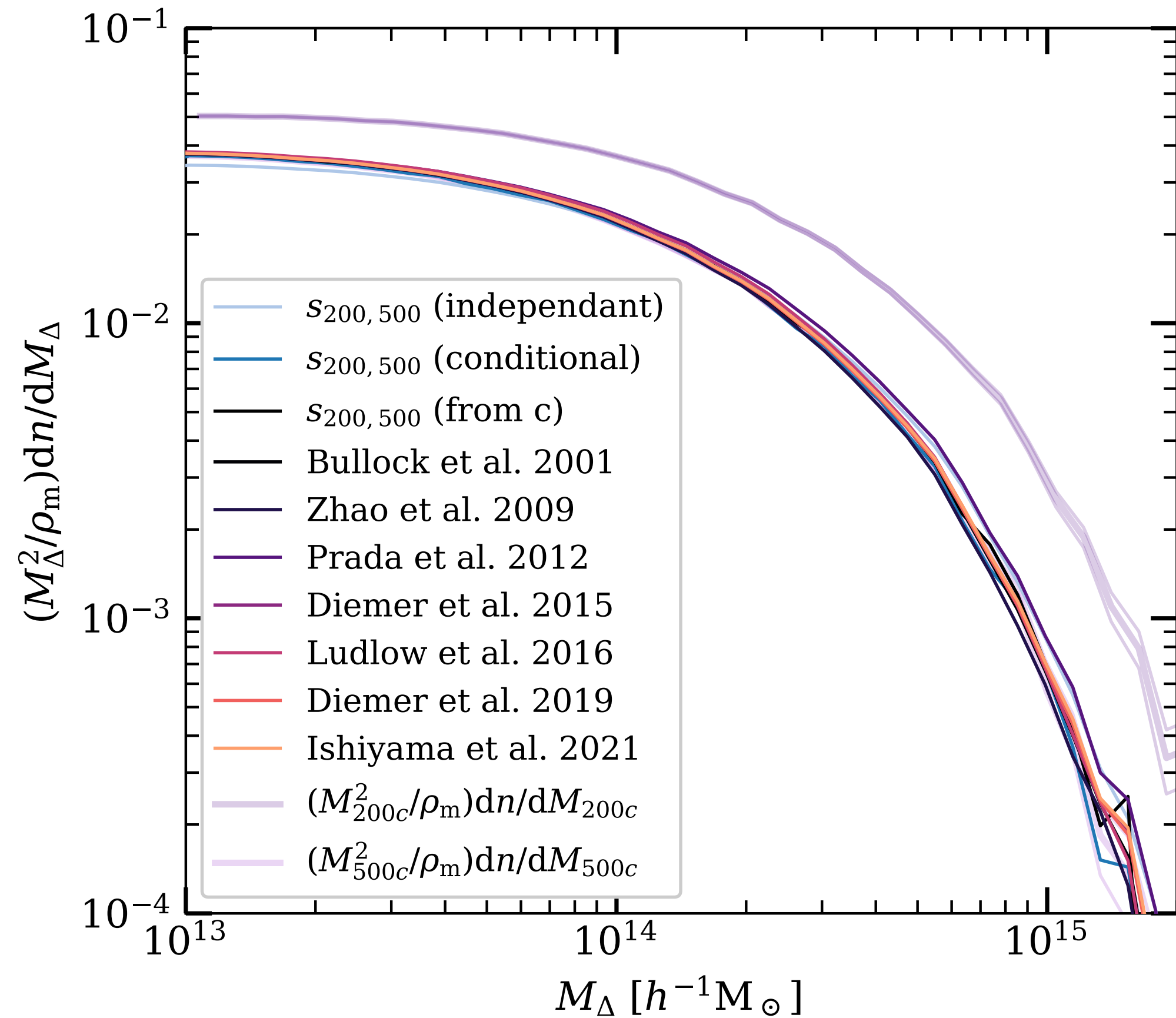
# Connecting HMF and $c(M, z)$



By transforming the NFW  $c(M, z)$  relation into a  $s_{\Delta_1, \Delta_2}(M, z)$  we can **transform the HMF**.

Inversely we can use the HMF defined for  $\Delta_1$  and  $\Delta_2$  to **predict** the  $c(M, z)$

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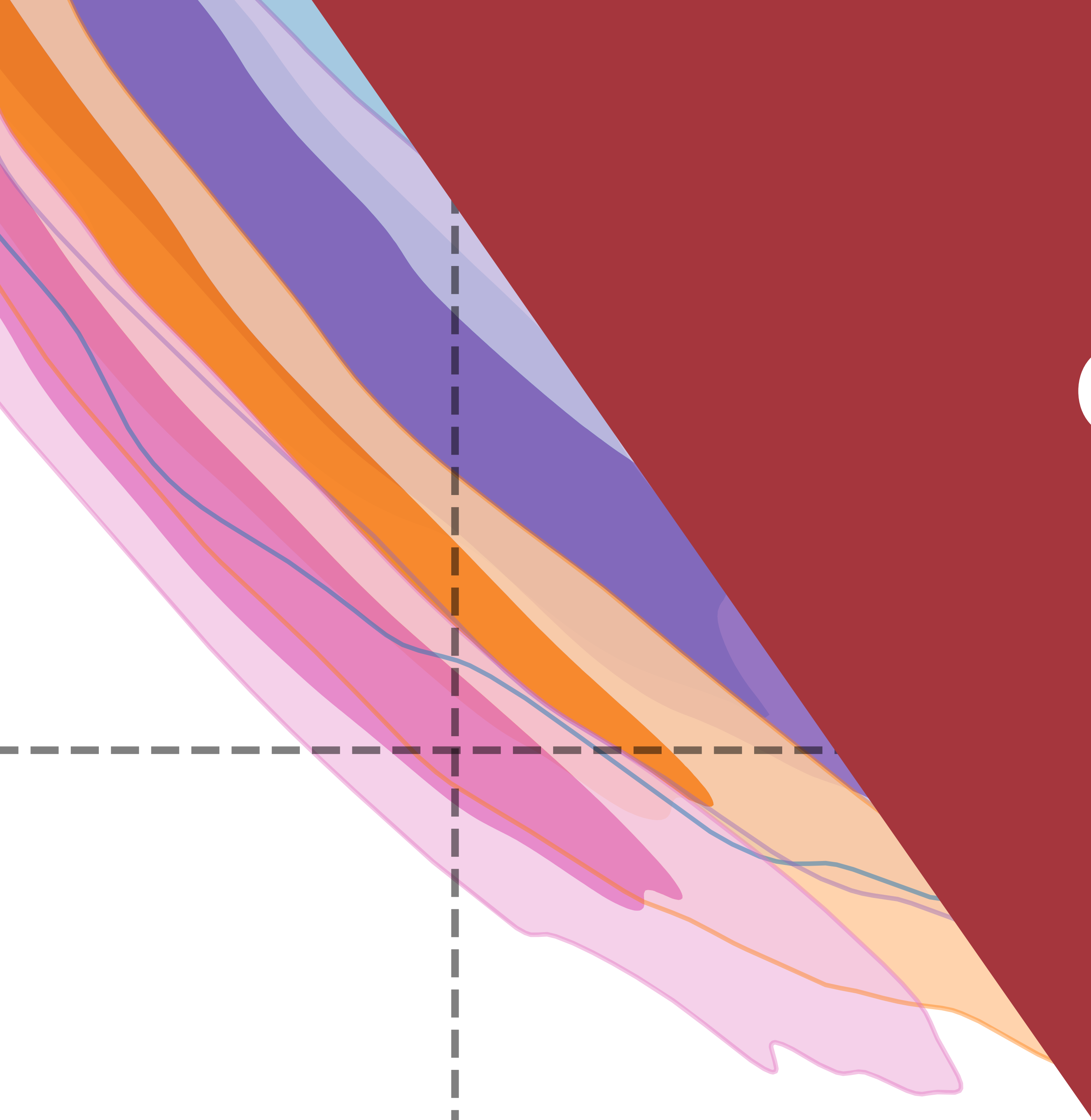


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# Cosmology with Sparsity



# Good old fashion Cosmology

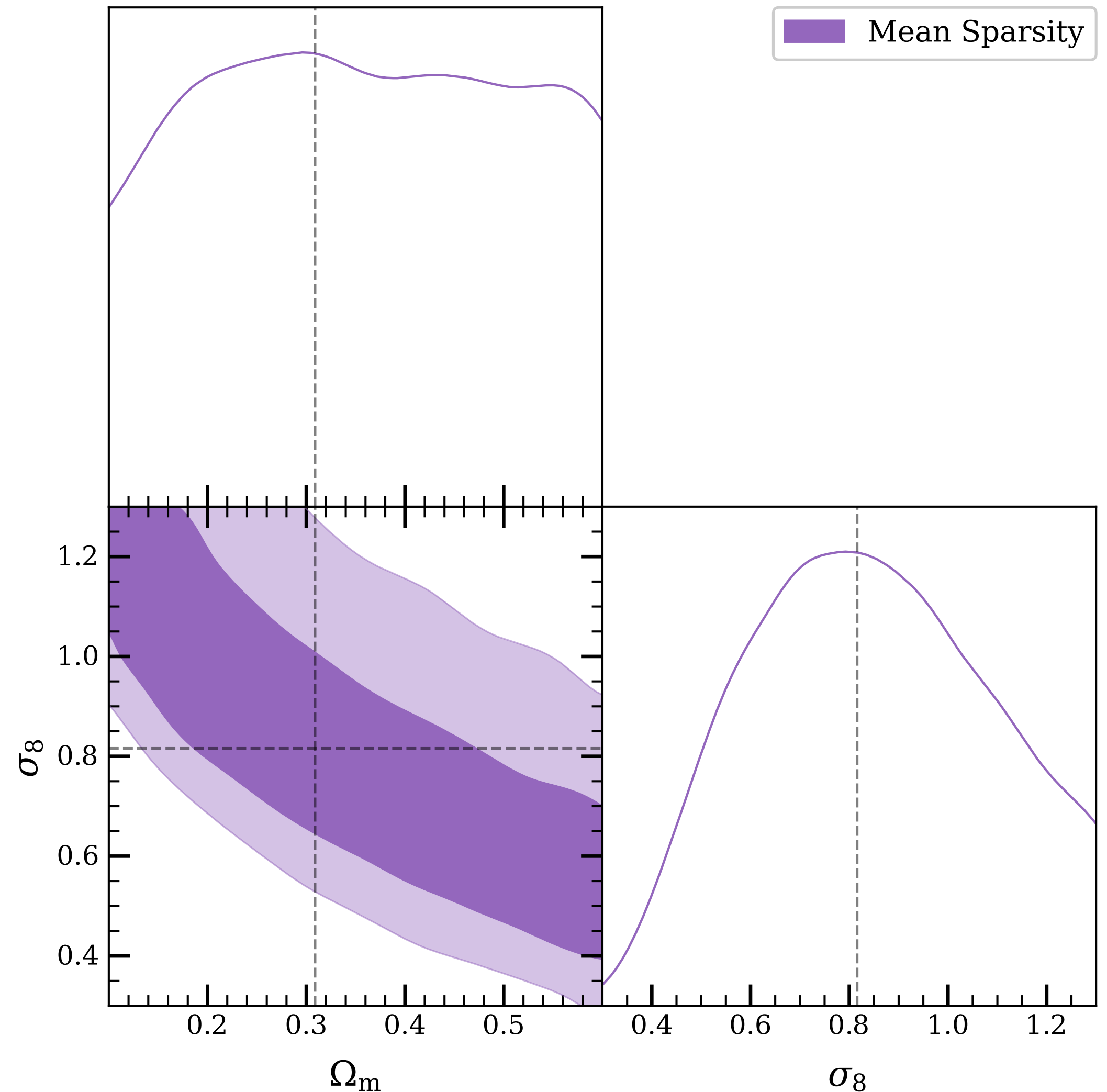
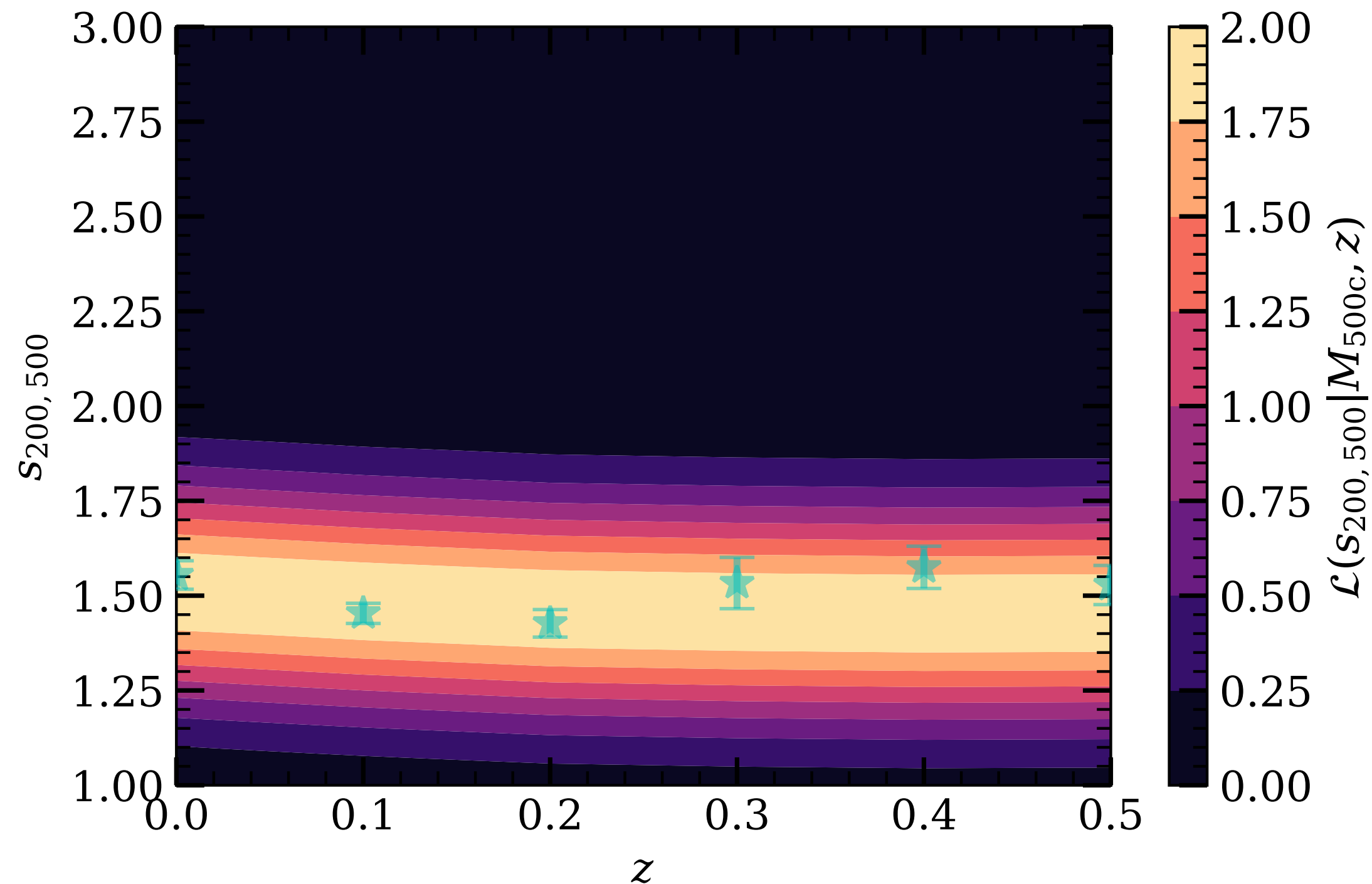
Gaussian likelihood obtained by solving,

$$\int \frac{dn}{dM_{\Delta_2}} d \ln M_{\Delta_2} = \langle s_{\Delta_1, \Delta_2} \rangle \int \frac{dn}{dM_{\Delta_1}} d \ln M_{\Delta_1},$$

Balmès et al. 2014

for  $\langle s_{\Delta_1, \Delta_2} \rangle$  (*More about this tomorrow*)

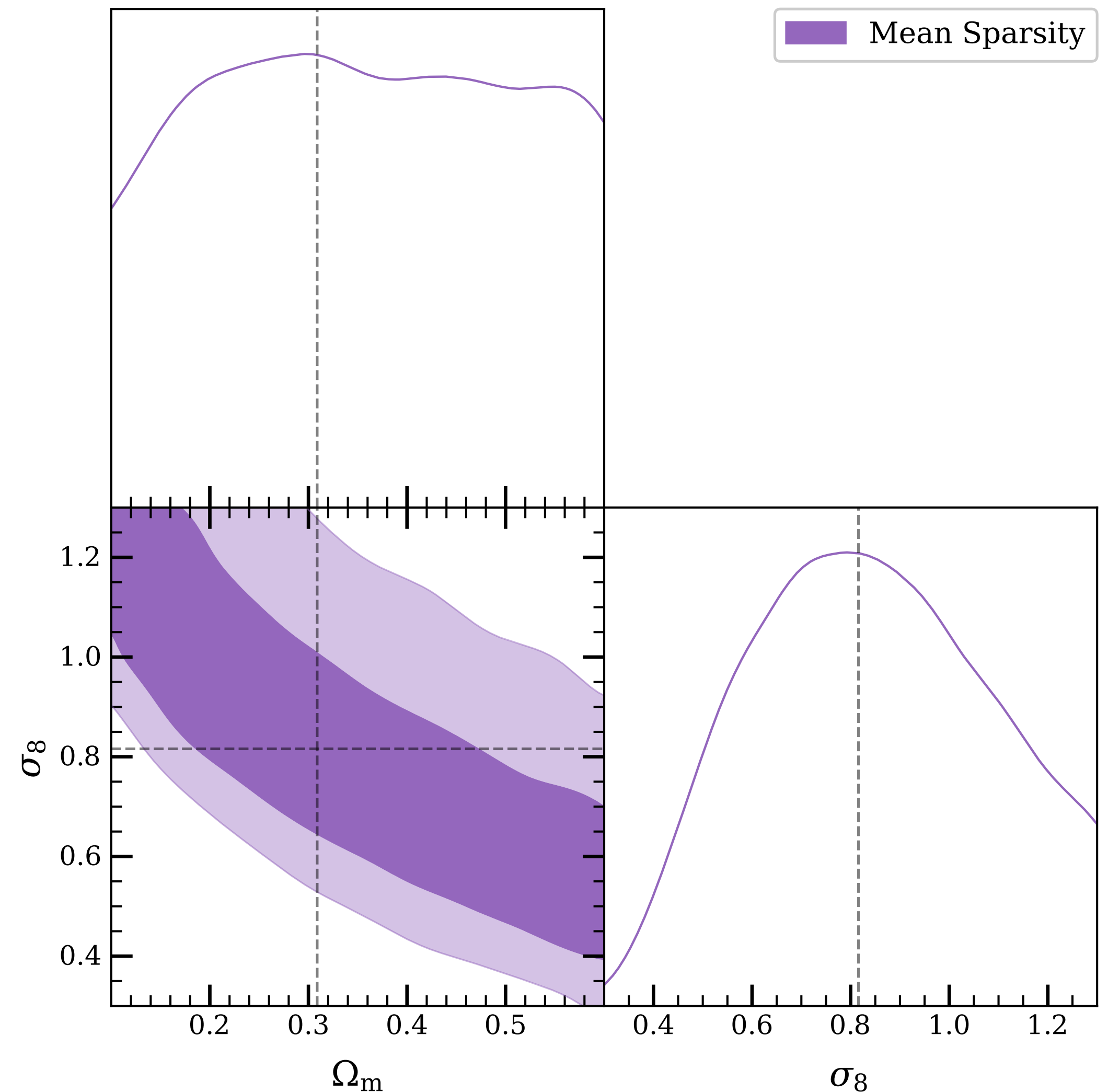
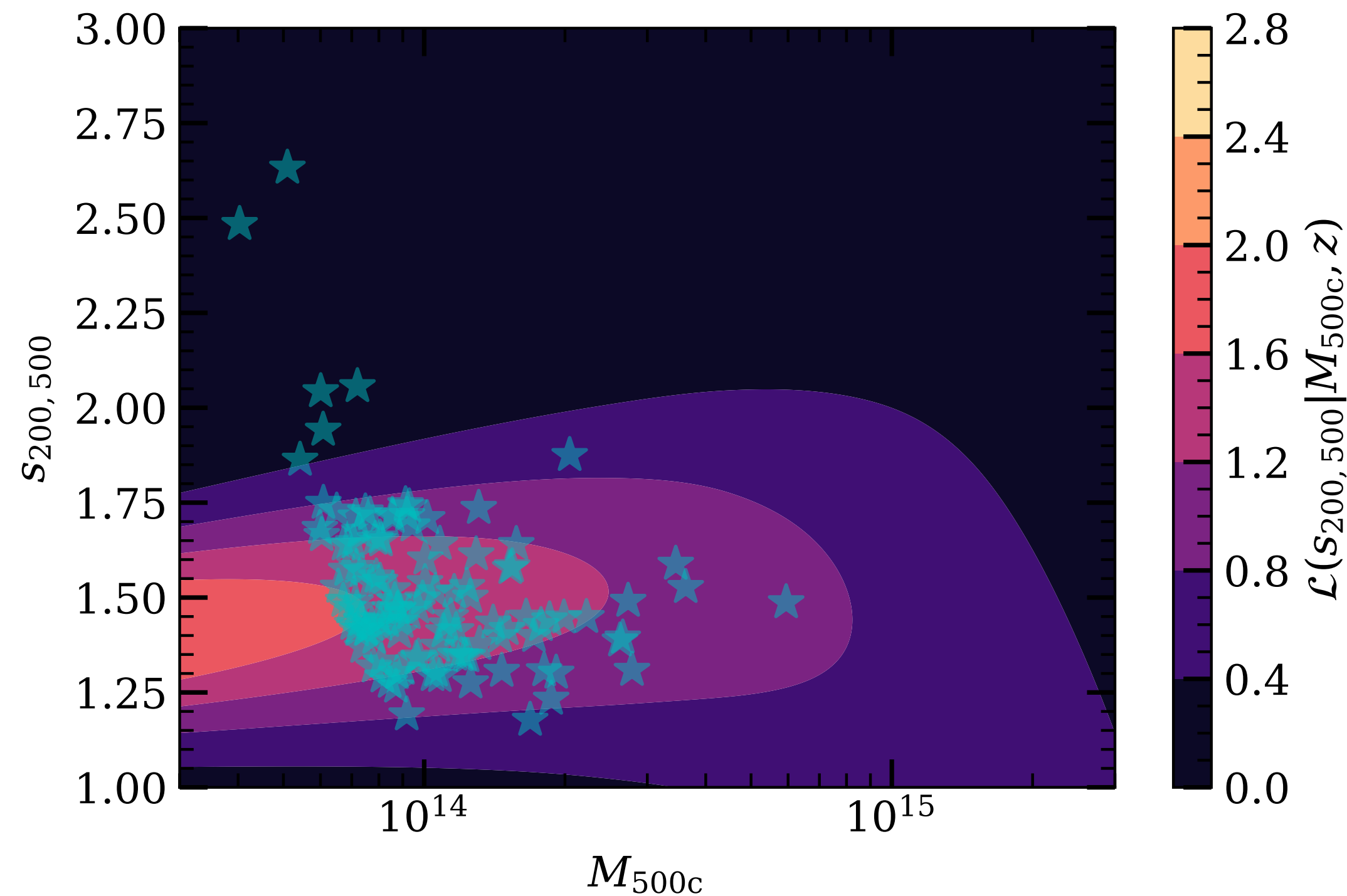
Corasaniti et al. 2019, 2021, 2022



# The future for sparsity

Let's do better:

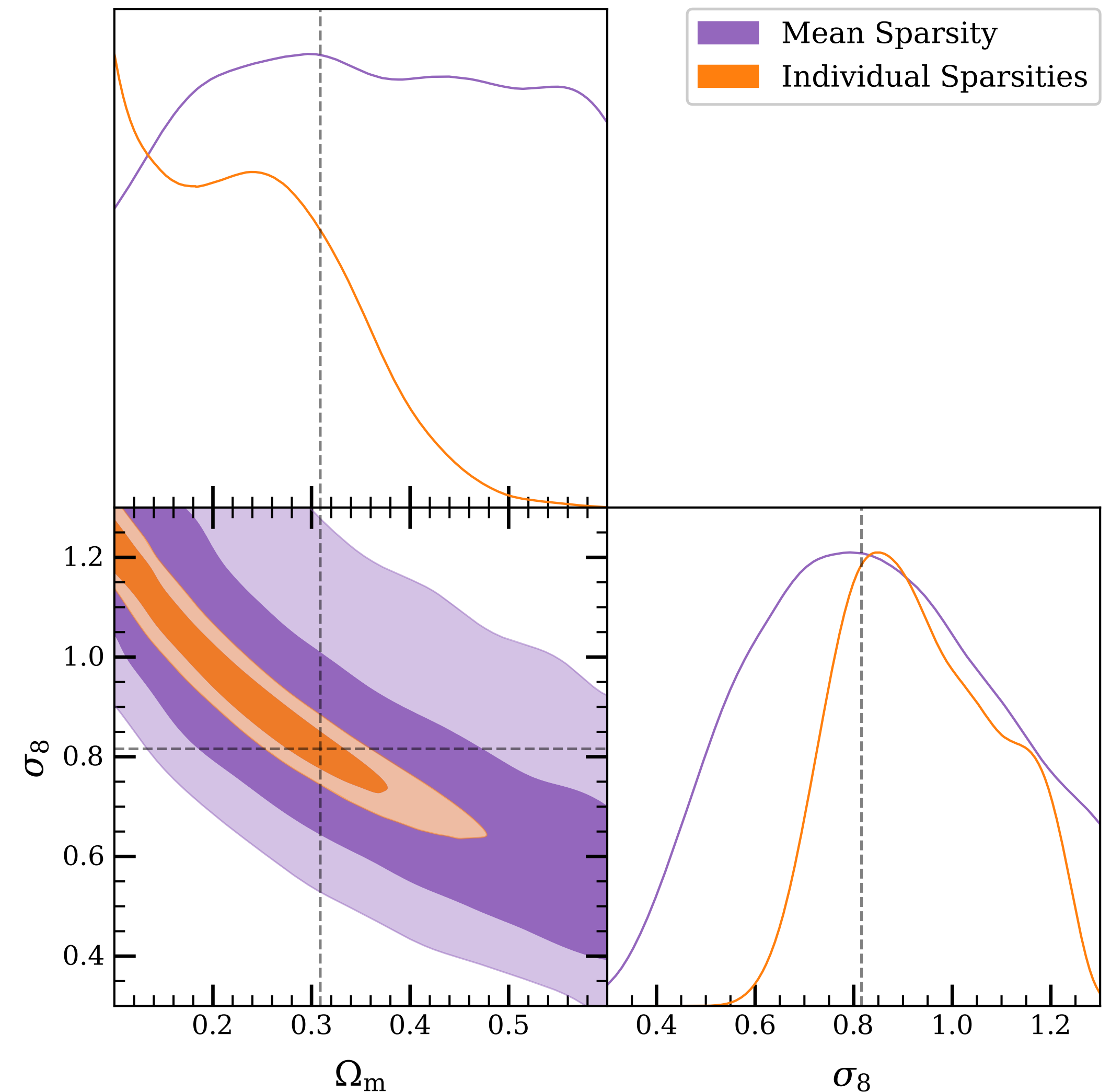
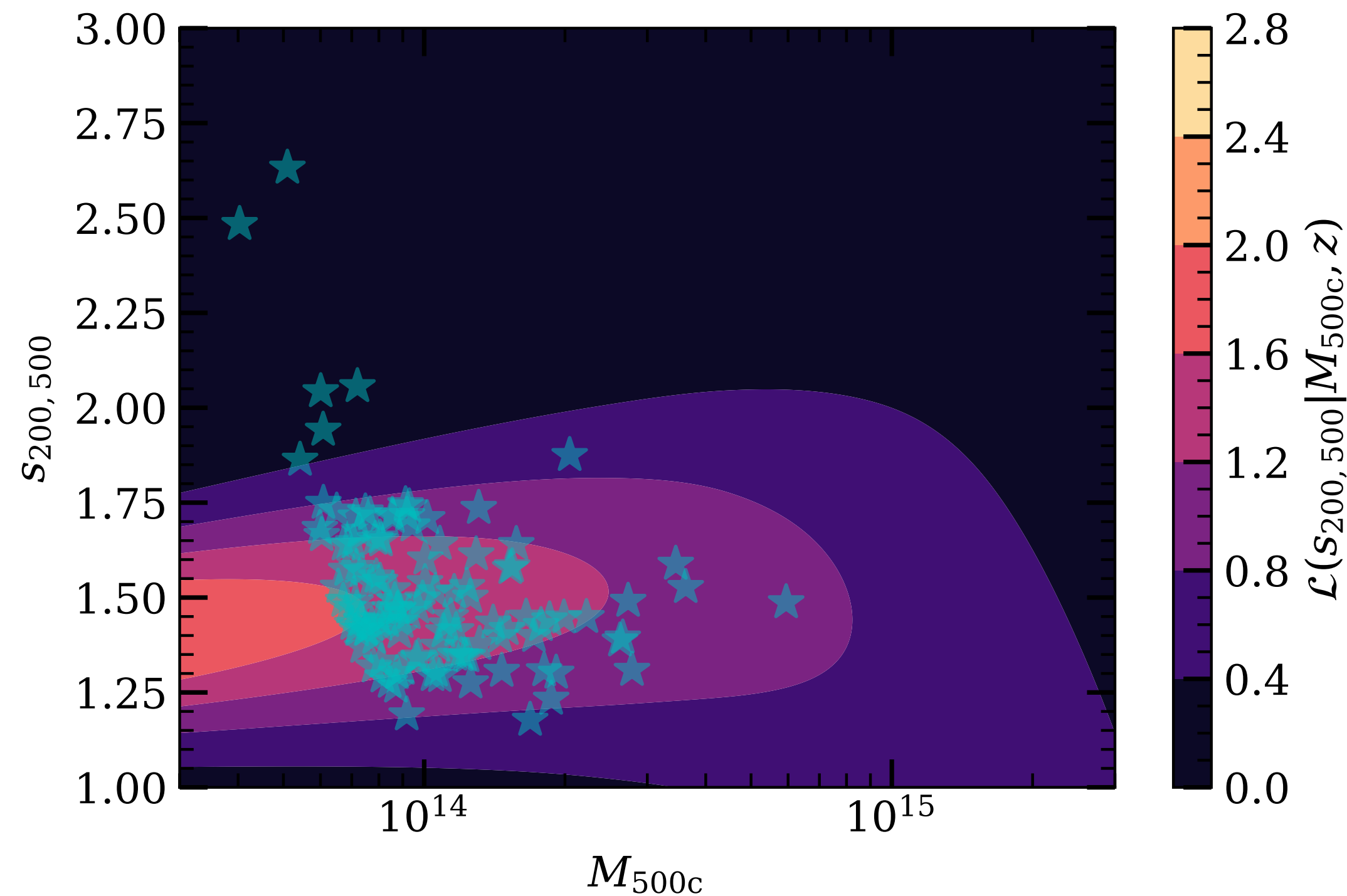
Assuming the  $\rho(s_{\Delta_1, \Delta_2} | M_{\Delta_2})$  is Gaussian we solve for  $\mu$  and  $\sigma^2$  that verify the **inward** and **outward** reconstruction.



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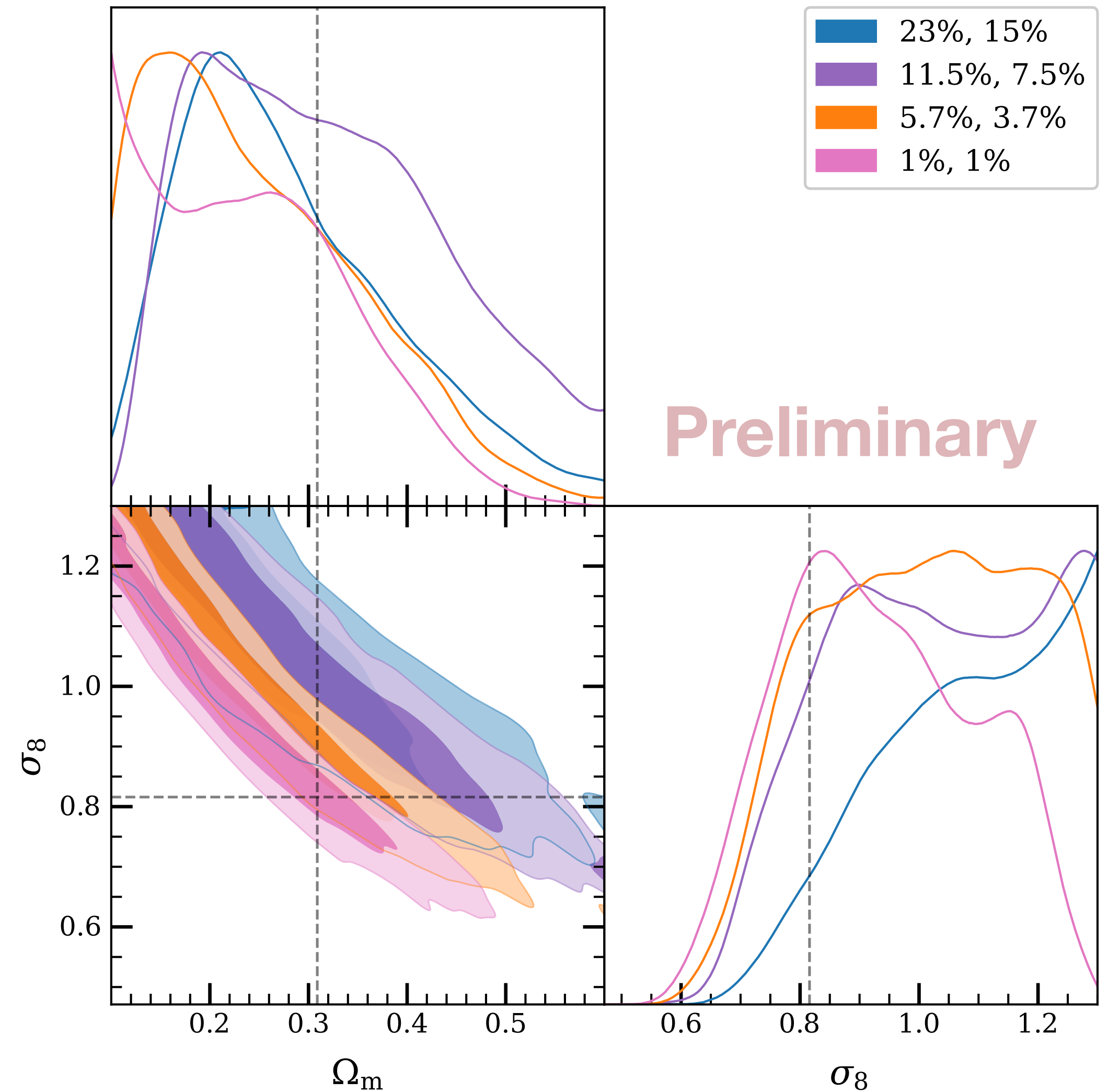
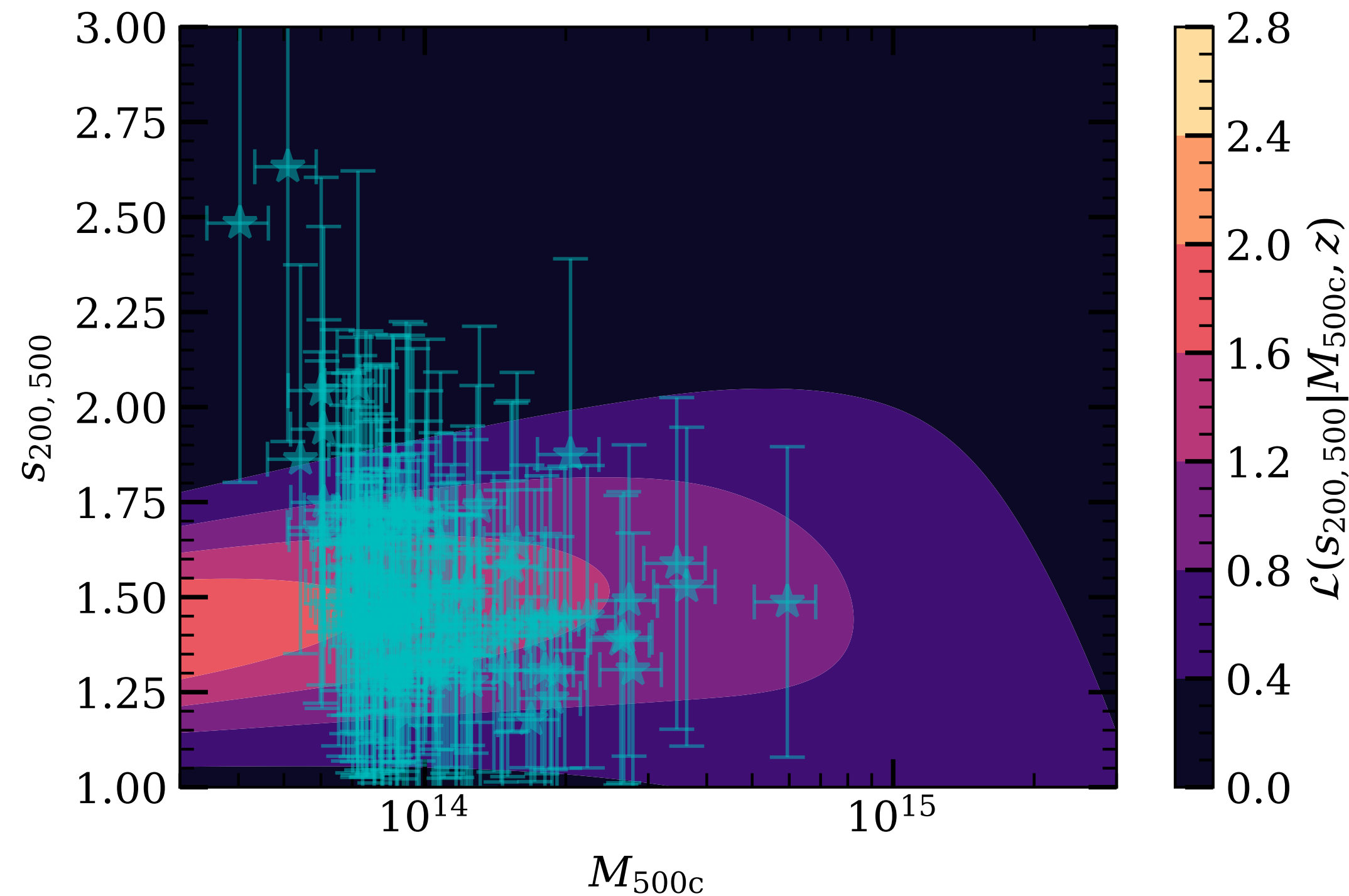
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# Too good to be true?

What about measurement errors?

Marginalising over realistic errors decreases the constraining power and introduces a bias towards large  $S_8$



# Summary

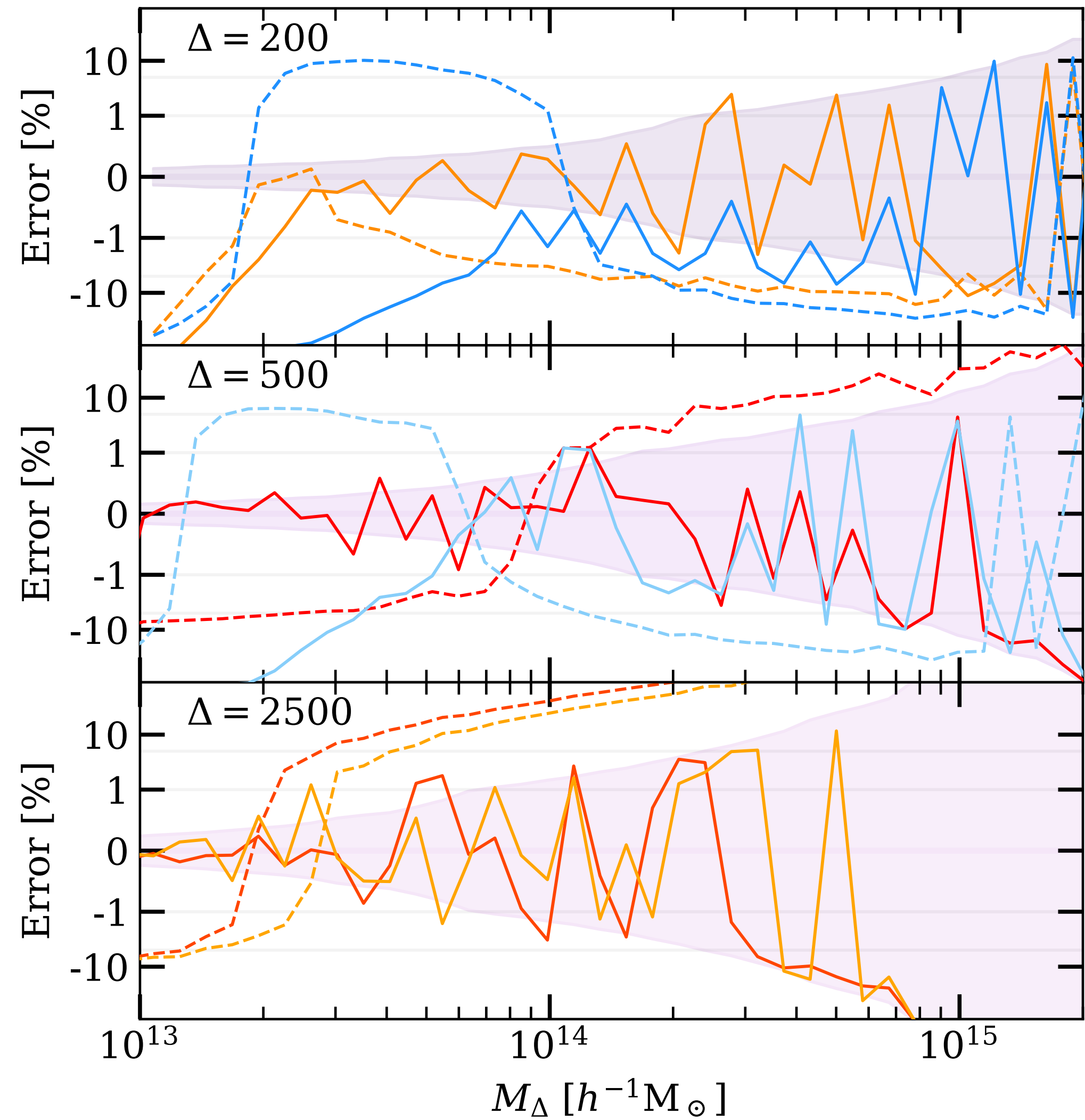
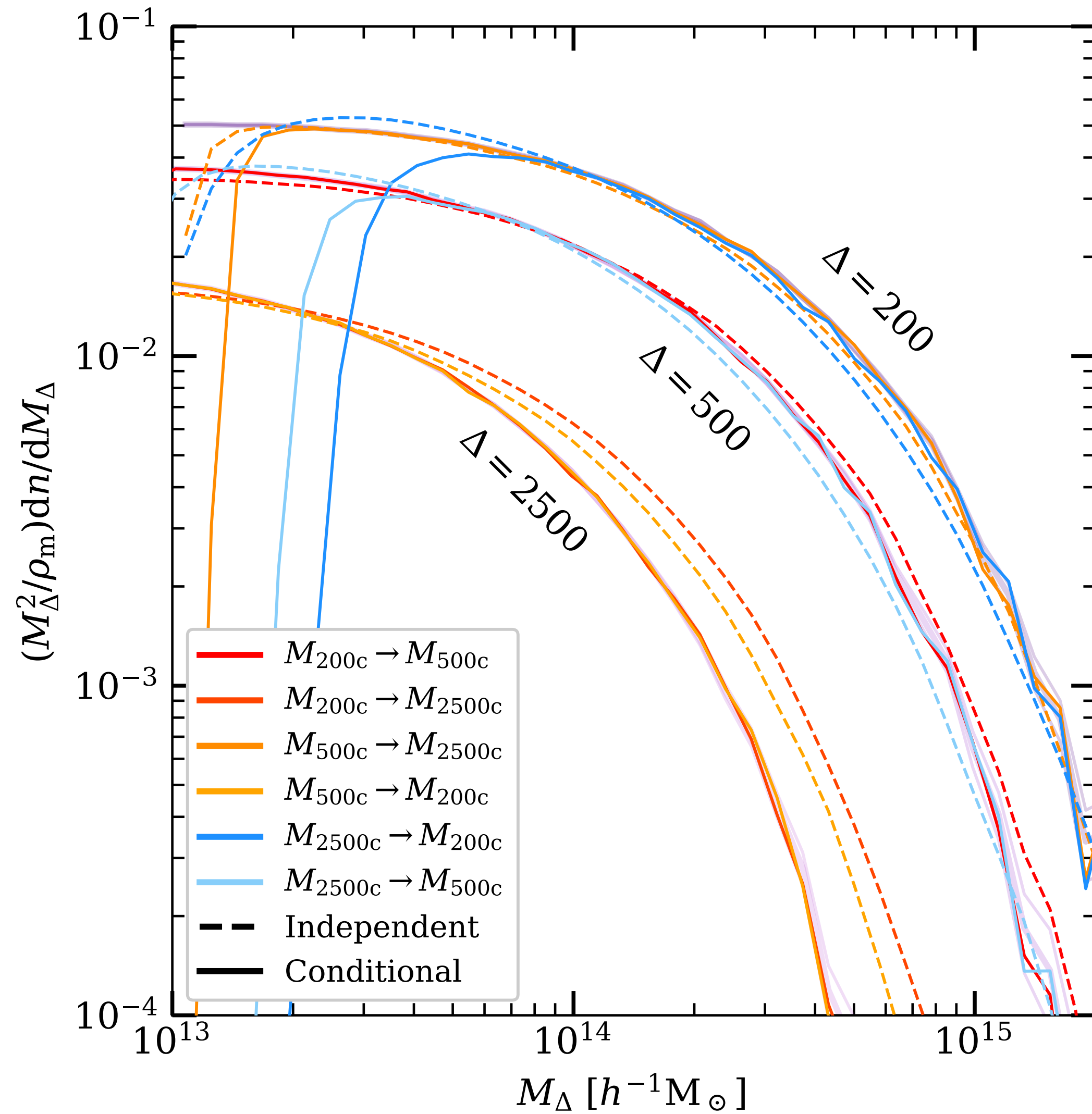
The **non-parametric nature** and **simple definition** of halo sparsity make it ideal to study the relationship between haloes and cosmological background.

Indeed we've seen that sparsity can:

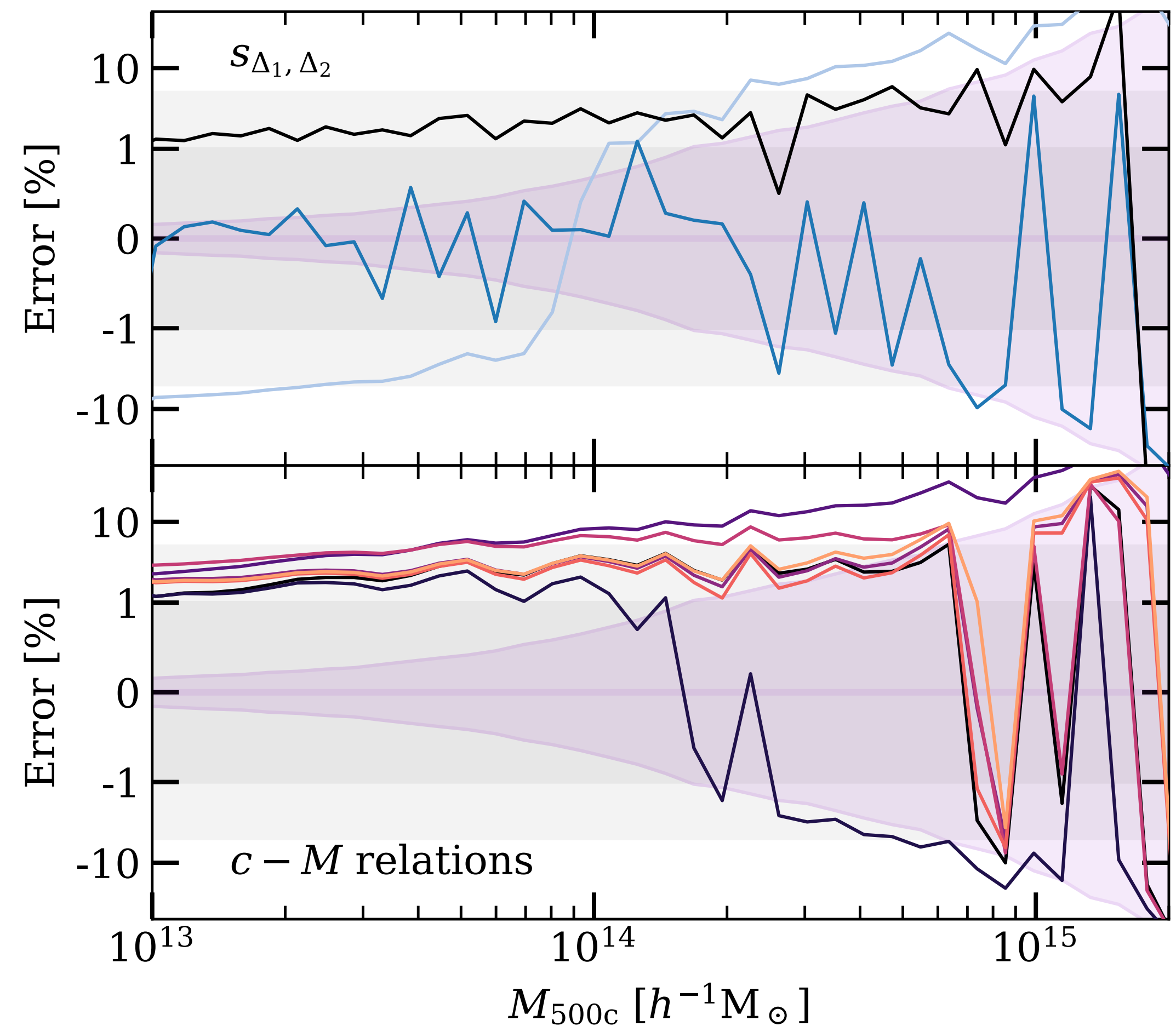
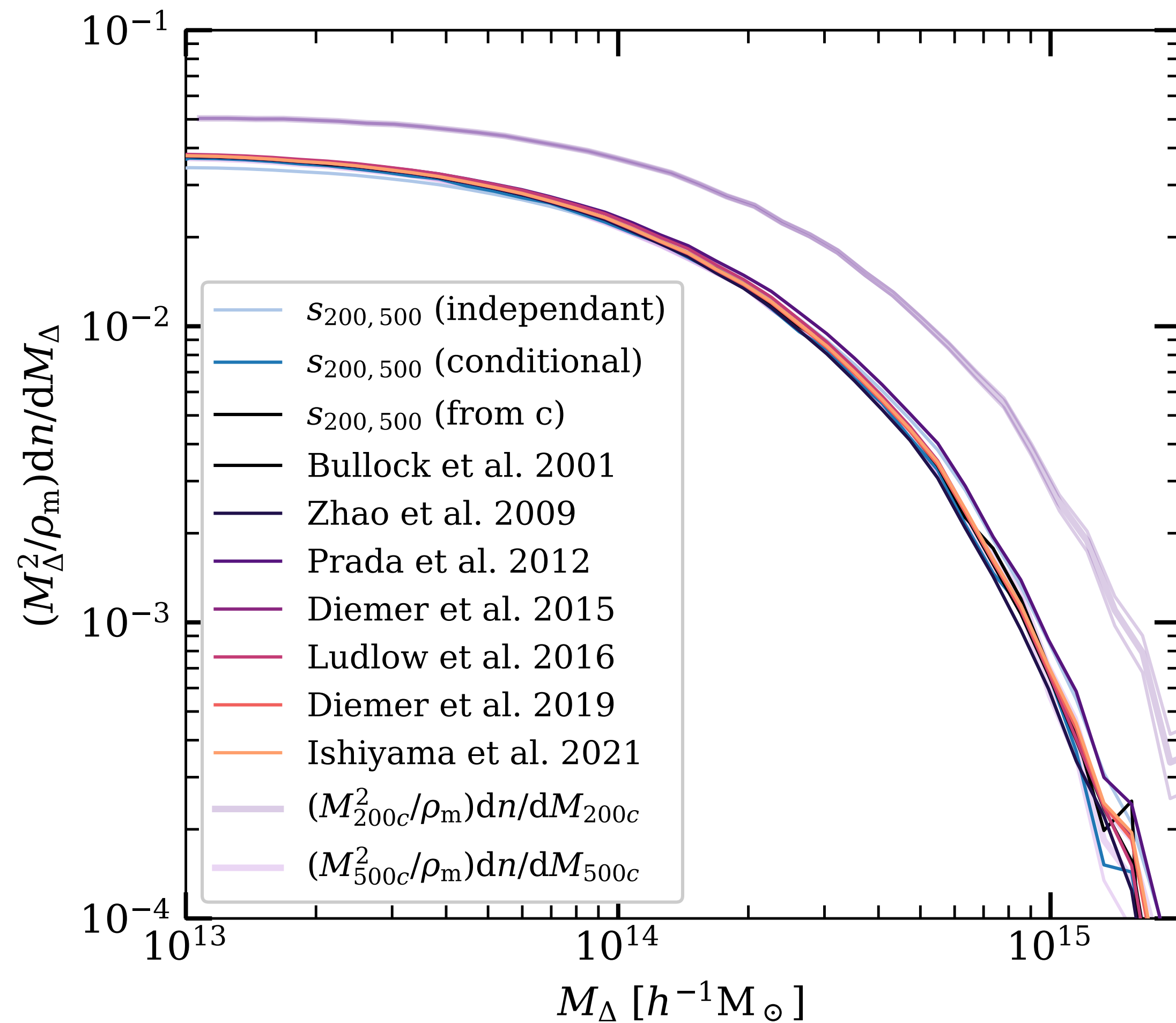
- **Detect** galaxy cluster major mergers
- **Recast** the Halo Mass Function from one mass definition to another
- **Constrain** cosmology using a restricted sample of cluster observations



# Sparsity Transformations



# Connecting HMF and $c(M, z)$





# Constraints with Concentrations

