



Impact of Property Covariance on Galaxy Cluster Weak-lensing Mass Calibration

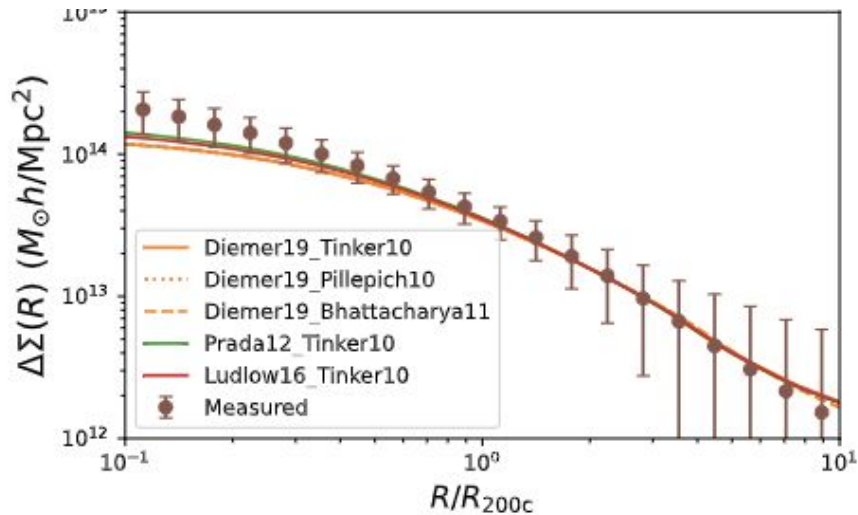
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Cosmology from Home 2023

THE DEPARTMENT OF
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THE UNIVERSITY OF CHICAGO



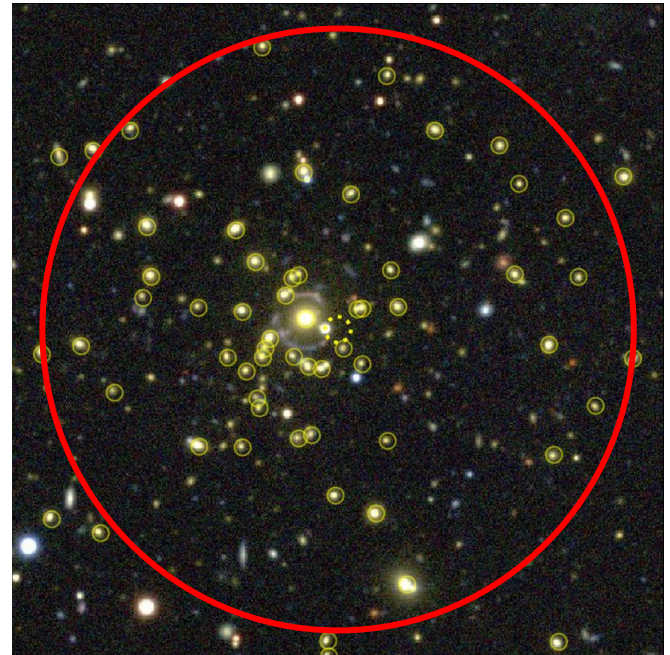
Weak lensing Observables



Cluster lensing – excess shear measurement of source galaxies when lensed by galaxy clusters.

$$\Sigma(R) = \Omega_m \rho_{\text{crit}} \int_{-\infty}^{+\infty} dz \xi_{\text{hm}}(\sqrt{R^2 + z^2}).$$

$$\Delta\Sigma = \bar{\Sigma}(< R) - \Sigma(R)$$

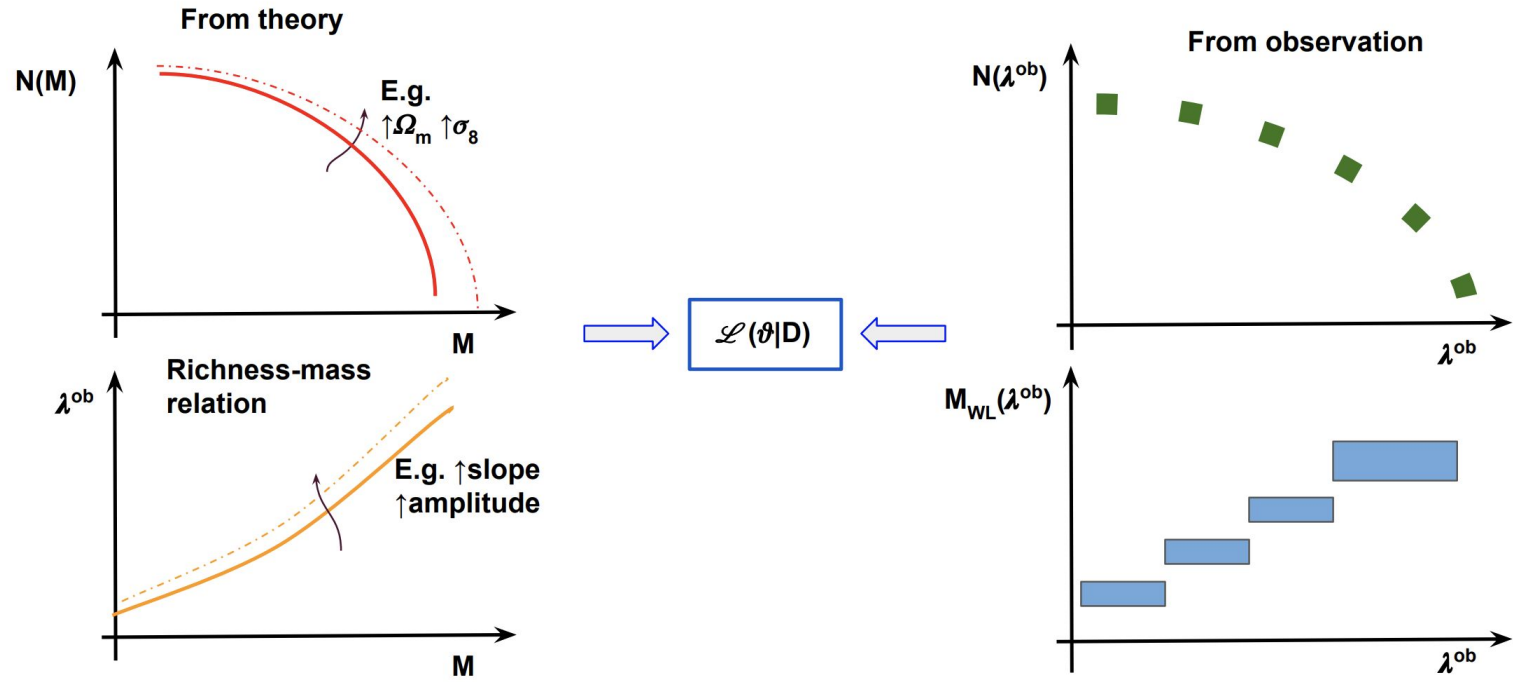


Richness – probabilistic number count of galaxies detected using red-sequence

$$\lambda = \sum p(\mathbf{x}|\lambda) = \sum_{R < R_c(\lambda)} \frac{\lambda u(\mathbf{x}|\lambda)}{\lambda u(\mathbf{x}|\lambda) + b(\mathbf{x})}.$$

Cluster Cosmology with optical surveys

- Combine cluster abundance and Weak lensing cluster mass estimates to simultaneously constrain cosmology and the richness-mass relation



Systematic Biases with Cluster Observables

- Uncertainty shear measurements
- Photo-z uncertainty
- Triaxiality
- Miscentering
- Line-of-sight projection
- Membership dilution
- Modeling systematics
- Cosmology dependence

In DES Y1:

Total systematic uncertainty: 4.3%

Statistical: 2.4%

Statistical uncertainty dominated by shape noise:

- $n_s = \sim 5$ galaxies/arcmin²
- $n_s = \sim 30$ galaxies/arcmin² for next-gen optical survey, e.g. Rubin (LSST)

Systematics on par with statistical errors, soon to dominate for near future surveys

Unconstrained systematic — Correlated scatter

$$\text{hmf}(\ln M, z) = \frac{dn_{\text{hmf}}(\ln M, z)}{d \ln M} \approx A(z) \exp[-\gamma(m, z) \ln M]$$

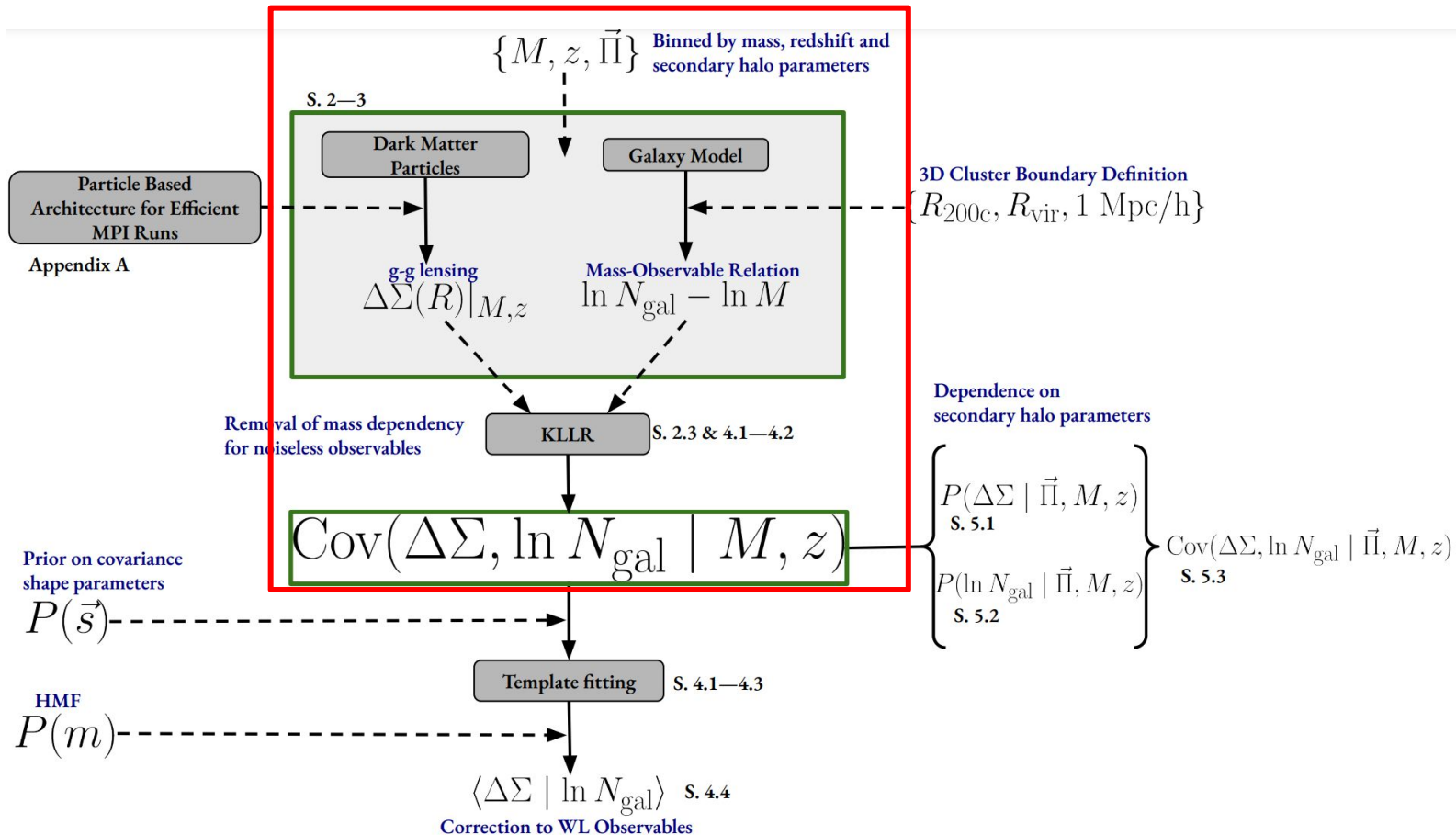
$$\langle \Delta \Sigma | N_{\text{gal}} \rangle_1 = \langle \Delta \Sigma | M \rangle + \frac{\gamma_1}{\alpha_n} \times \text{Cov}(\Delta \Sigma, \ln N_{\text{gal}} | M, z),$$

This term left unconstrained by
McClintock+19, DES 2020

Dataset: MDPL2 N-body simulation with
SAGE semi-analytic galaxy model

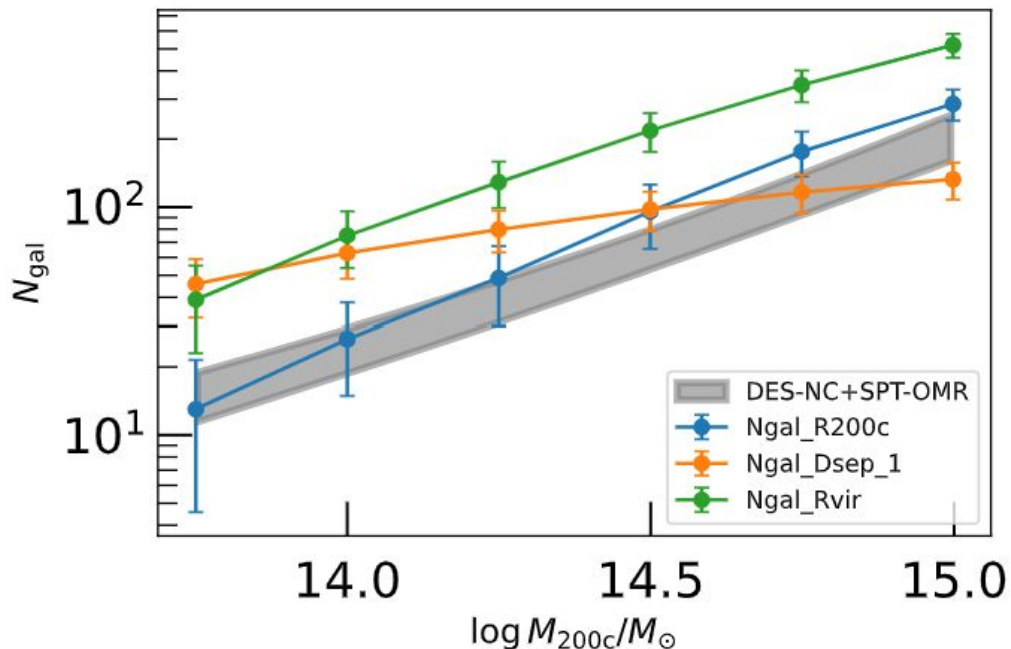
Goal: Set informative priors using mock
measurements of the correlated scatter
between WL-observables

Outline: Data Vector



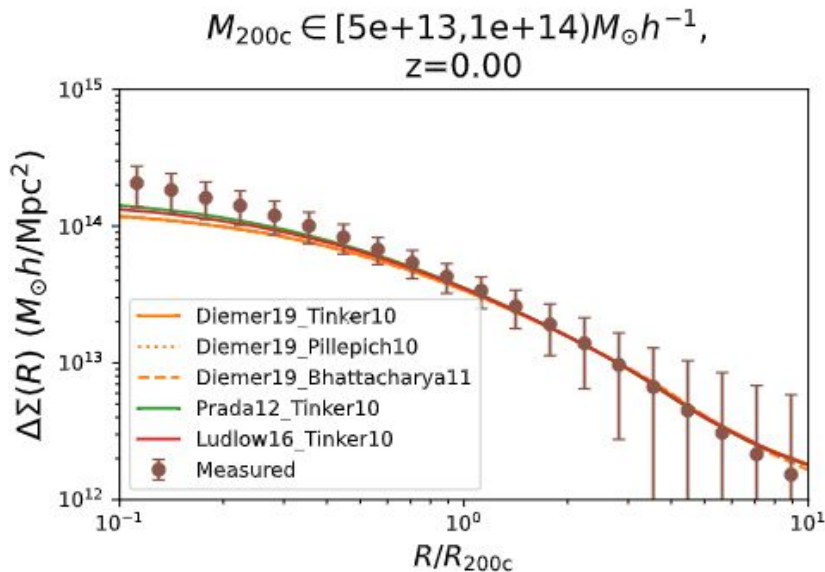
Ngal: True Richness Estimator

- Number count of galaxies enclosed inside a radius
3D Cluster Boundary Definition
 $\{R_{200c}, R_{vir}, 1 \text{ Mpc}/h\}$
- No stellar, color cut; no projected galaxies along LOS
- Test for robustness against different radius definitions.



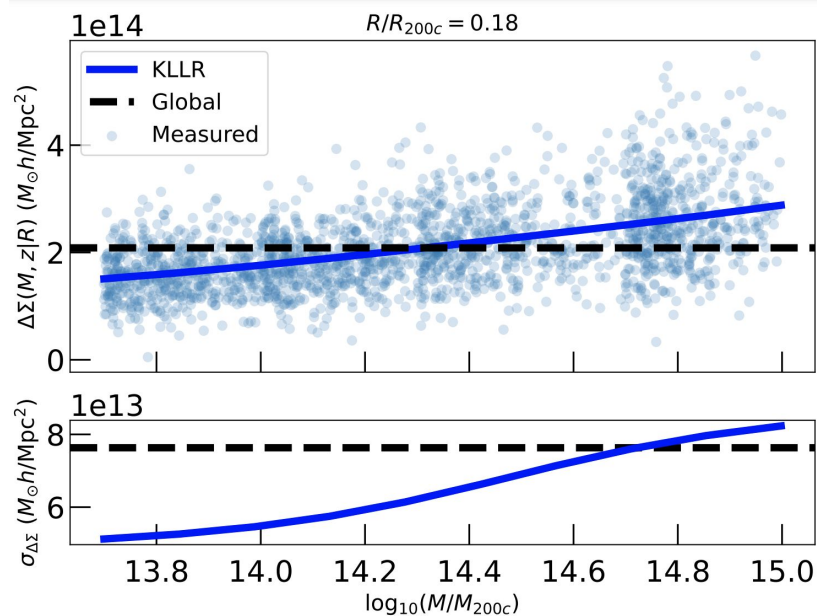
cluster lensing

- Computed directly from DM particles
- (M,z) span optical cluster range
- Plotted against cosmology dependent models
 - c-M relation
 - halo bias
- Given errors are consistent with models but unable to distinguish

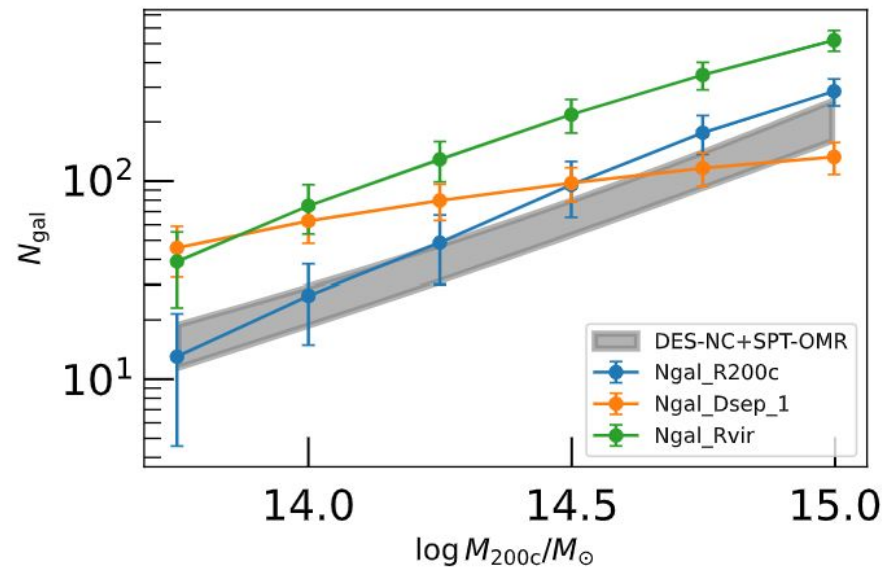


KLLR – Kernel Local Linear Regression

A. Farahi+21

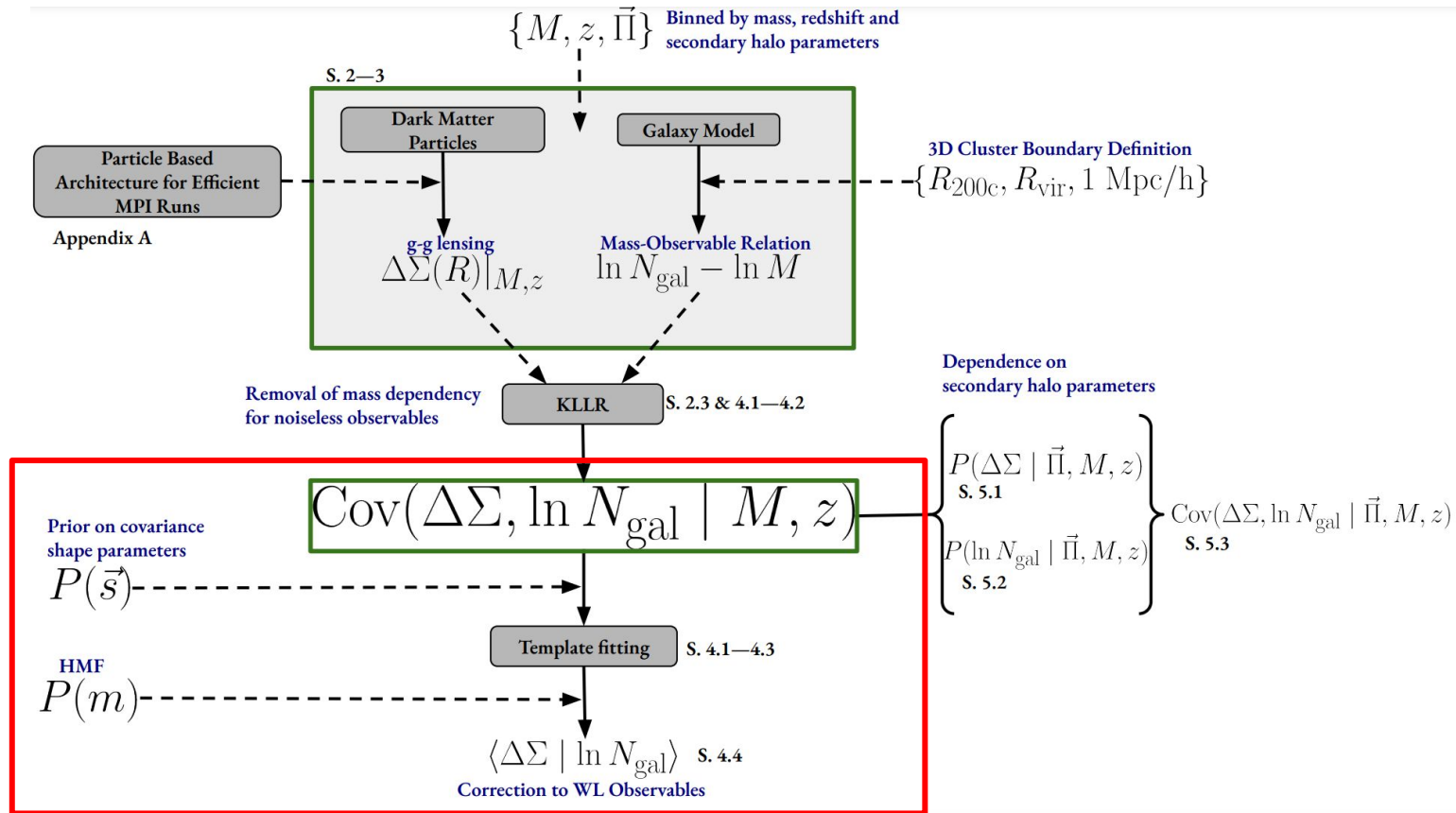


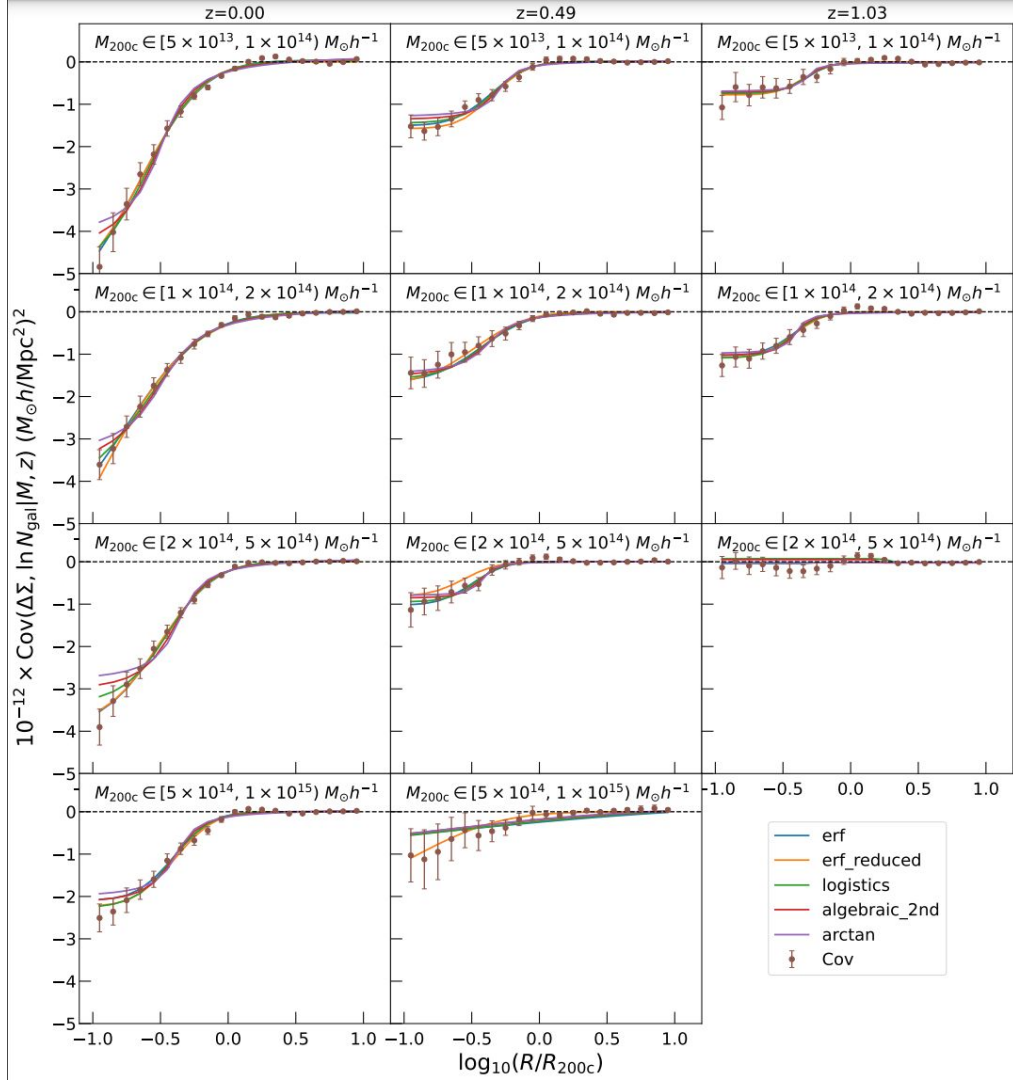
Local/global scatter of cluster lensing using KLLR



Local log-linear richness-mass relation using KLLR

Outline: Cov. measurement and modeling





- Negative at small scales, null at large scales
- Modeled as an offset error function
- Four parameter model

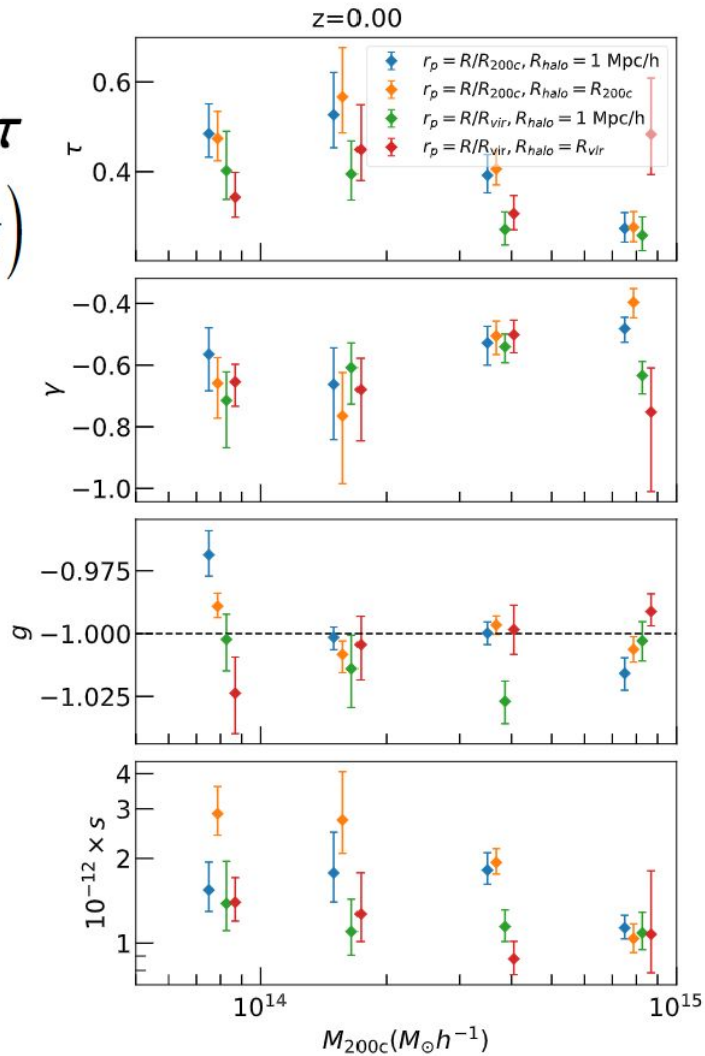
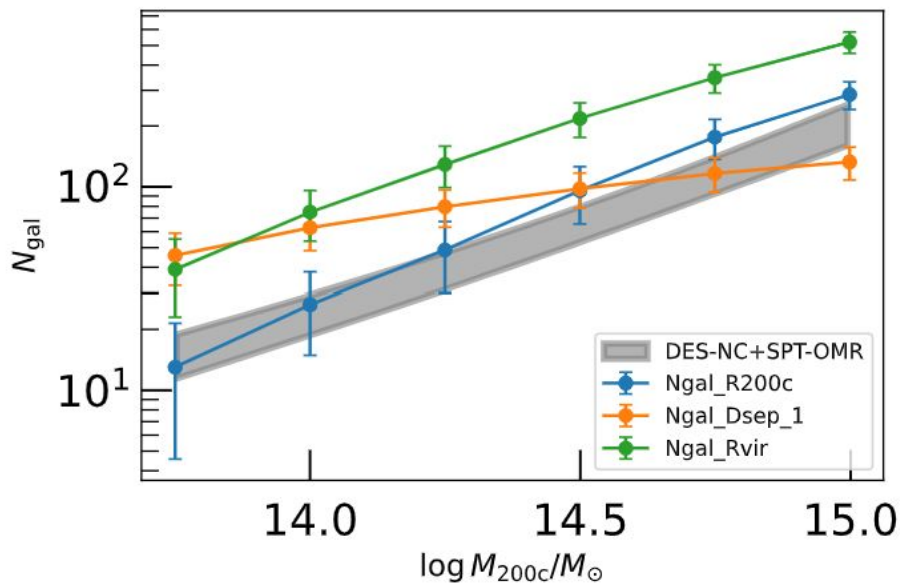
$$\tilde{x} = (x - \gamma) / \tau.$$

$$s\left(\text{erf}\left(\frac{\sqrt{\pi}}{2} \tilde{x}\right) + g\right)$$

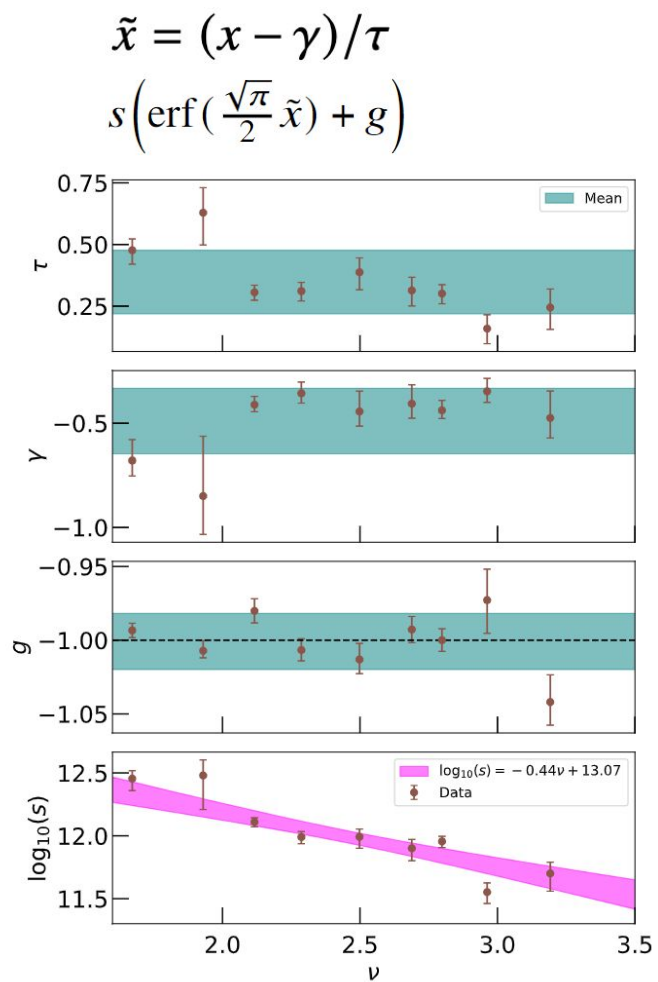
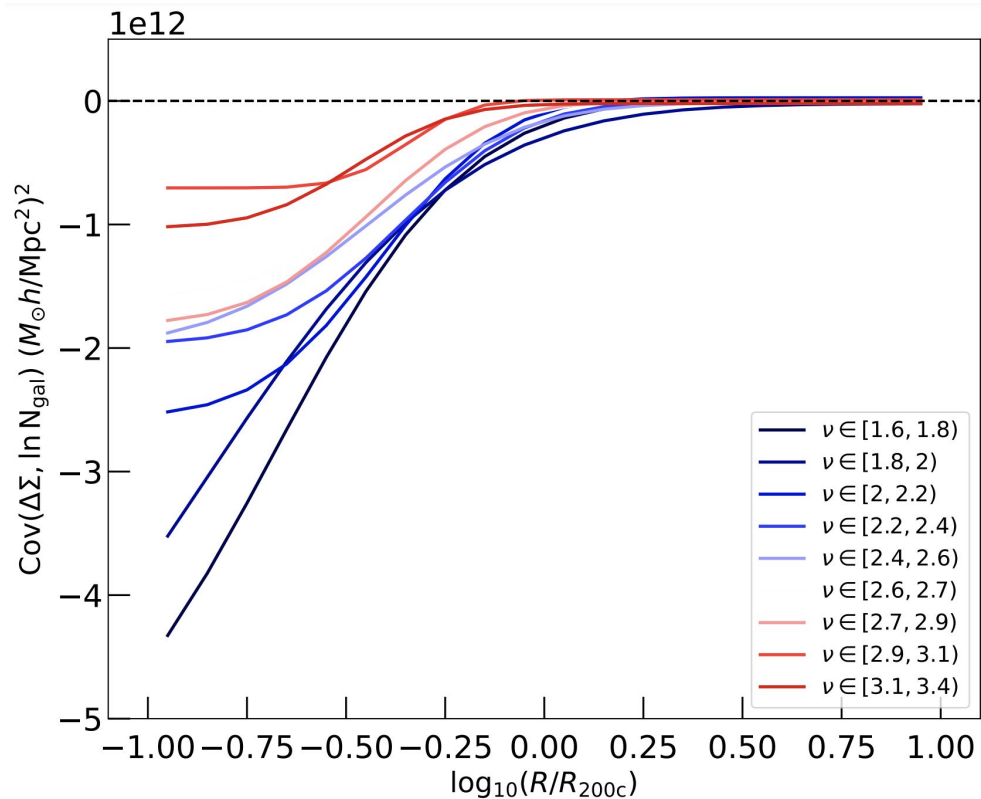
Modeling: Impact of Radius definition

$$\tilde{x} = (x - \gamma) / \tau$$

$$s\left(\text{erf}\left(\frac{\sqrt{\pi}}{2} \tilde{x}\right) + g\right)$$



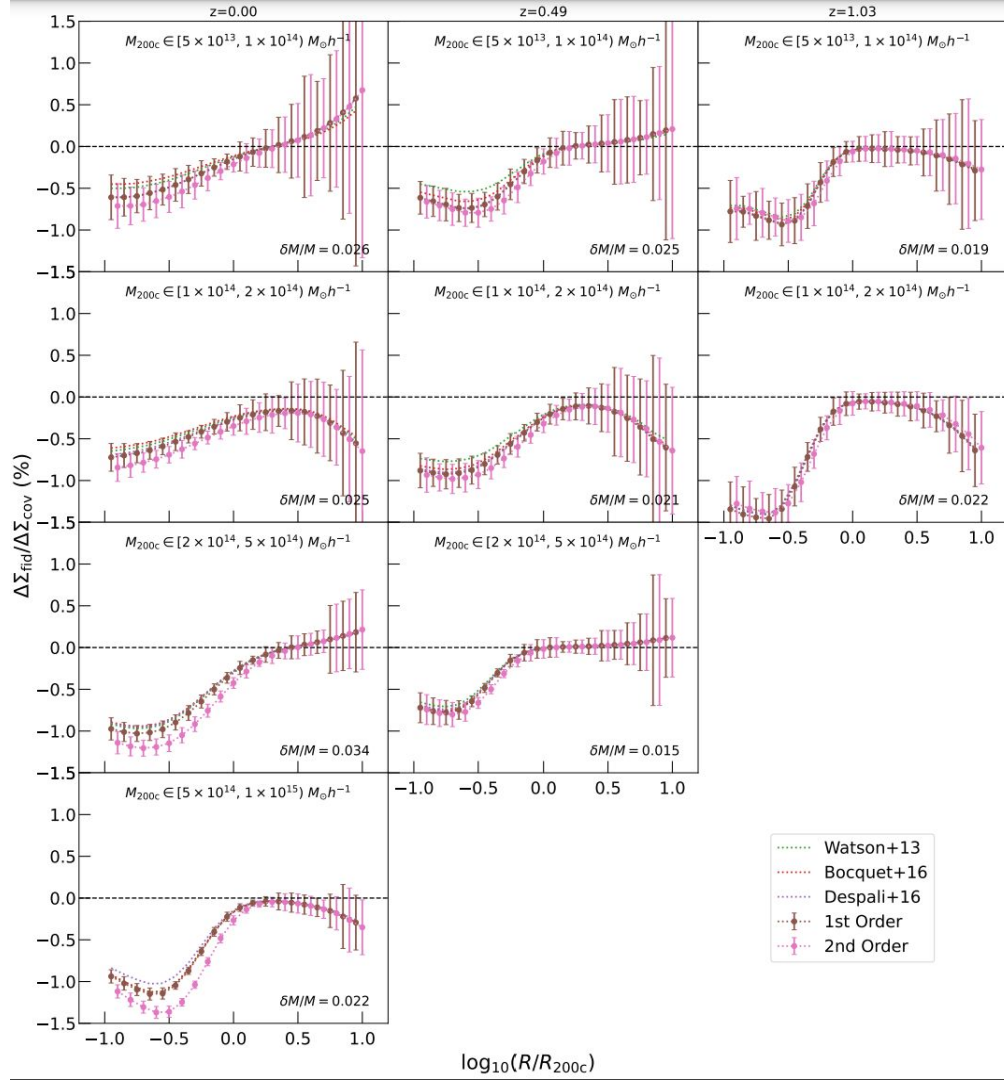
Binning by halo peak height $\nu = \frac{\delta_c}{\sigma(R, a)}$



$$\langle \Delta\Sigma | N_{\text{gal}} \rangle_1 = \langle \Delta\Sigma | M \rangle + \frac{\gamma_1}{\alpha_n} \times \text{Cov}(\Delta\Sigma, \ln N_{\text{gal}} | M, z)$$

$$\langle \Delta\Sigma | N_{\text{gal}} \rangle_2 = \langle \Delta\Sigma | N_{\text{gal}} \rangle_{\text{fid}} + \left[\frac{x_s}{\alpha_n} (\gamma_1 + \gamma_2 \delta_n) \text{Cov}(\Delta\Sigma, \ln N_{\text{gal}} | M, z) \right].$$

- ~1% bias on stacked lensing at small scales
- Propagated into 2-3% mass bias

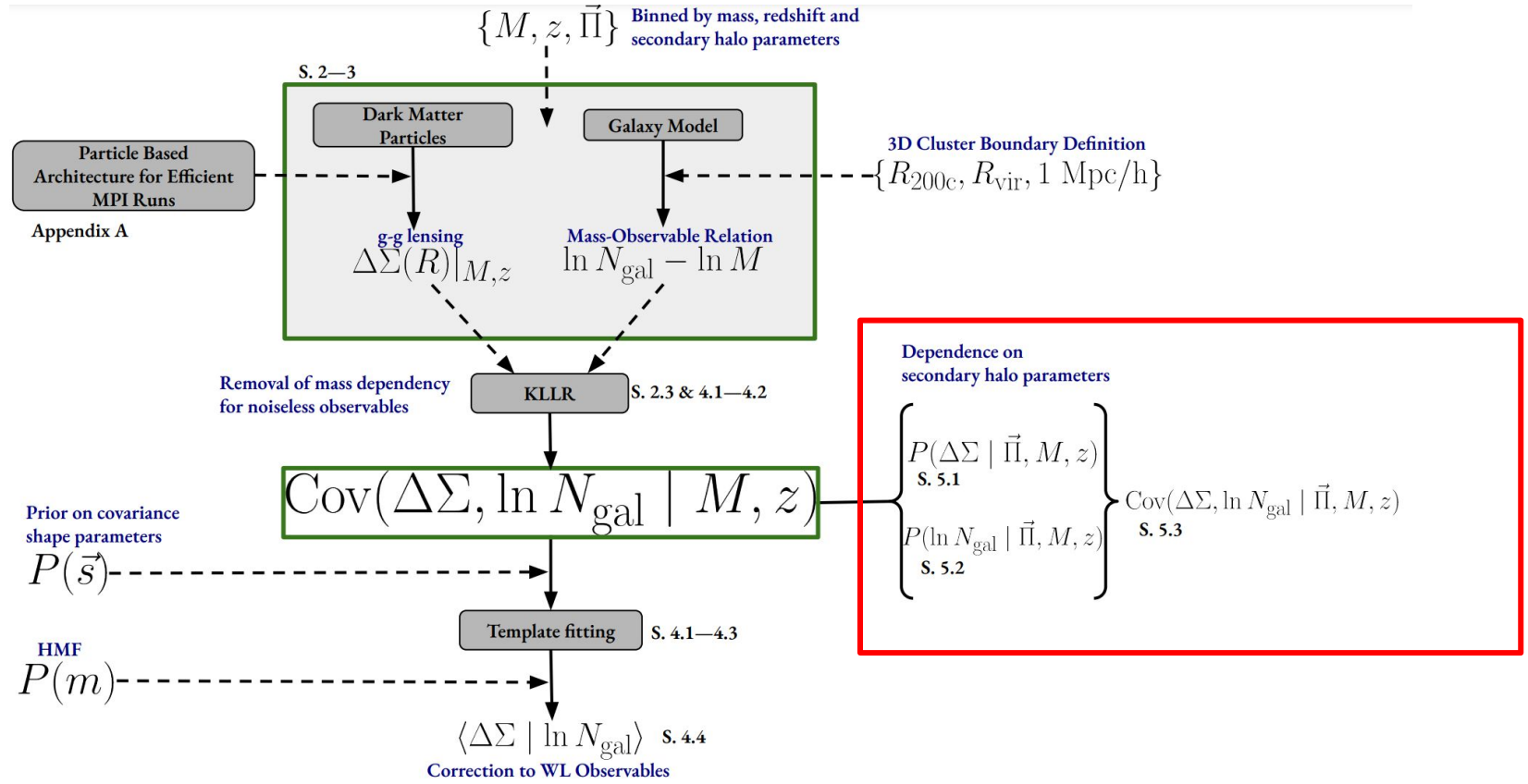


Source of systematic	SV Amplitude uncertainty	Y1 Amplitude Uncertainty
Shear measurement	4%	1.7%
Photometric redshifts	3%	2.6%
Modeling systematics	2%	0.73%
Cluster triaxiality	2%	2.0%
Line-of-sight projections	2%	2.0%
Membership dilution + miscentering	$\leq 1\%$	0.78%
Total Systematics	6.1%	4.3%
Total Statistical	9.4%	2.4%
Total	11.2%	5.0%

McClintock+19

Uncorrelated scatter 2-3% bias needs to be modeled!

Outline: Secondary halo parameter dependence



Secondary halo parameter dependence

$$\langle \ln N_{\text{gal}} | \Pi, M, z \rangle = \pi_n(m, z) + \alpha_n(m, z) \ln M + \vec{\beta}_n^T(m, z) \cdot \vec{\Pi} + \epsilon_n;$$

$$\langle \Delta\Sigma | \Pi, M, z \rangle = \pi_\tau(m, z) + \alpha_\tau(m, z) \ln M + \vec{\beta}_\tau^T(m, z) \cdot \vec{\Pi} + \epsilon_\tau,$$

$$\text{Cov}(\Delta\Sigma, \ln N_{\text{gal}} | M, z) = \text{Cov}(\vec{\beta}_\tau^T \cdot \vec{\Pi}, \vec{\beta}_n^T \cdot \vec{\Pi}) = \vec{\beta}_\tau^T \text{Cov}(\vec{\Pi}, \vec{\Pi}) \vec{\beta}_n.$$

Shin & Diemer+23 quantified correlation of secondary halo parameters

This project provides the slopes β

Parameter	Explanation
$\vec{\Pi}$	Set of secondary halo parameters
Γ_{inst}	instantaneous mass accretion rate (MAR)
$\Gamma_{100\text{Myr}}^*$	mean MAR over the past 100 Myr
Γ_{dyn}^*	mean MAR over virial dynamical time
$\Gamma_{2\text{dyn}}^*$	mean MAR over two virial dynamical time
Γ_{peak}	Growth rate of peak mass from current z to $z+0.5$
$\alpha_{1/2}$	Half mass scale factor
c_{vir}	R_{vir} concentration
$T/ U $	Absolute value of the kinetic to potential energy ratio
X_{off}	Offset of density peak from mean particle position (kpc h^{-1})
ρ_{Π_a, Π_b}	Correlation coefficient between secondary halo parameters

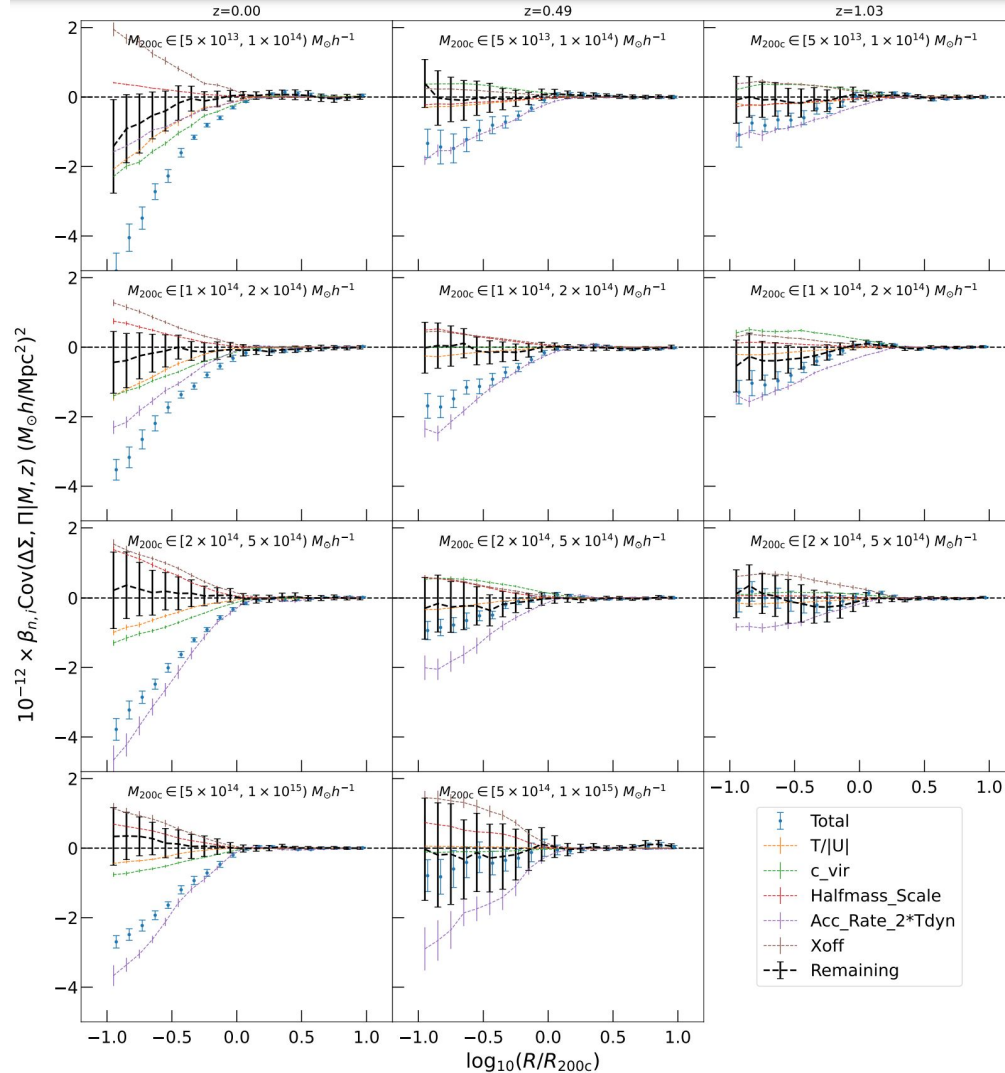
Cov. dependence on secondary halo parameters

$$\text{Cov}(\Delta\Sigma, \ln N_{\text{gal}} | M, z) = \sum_i \beta_{n,i}(m, z) \text{Cov}(\Delta\Sigma, \Pi_i | M, z).$$

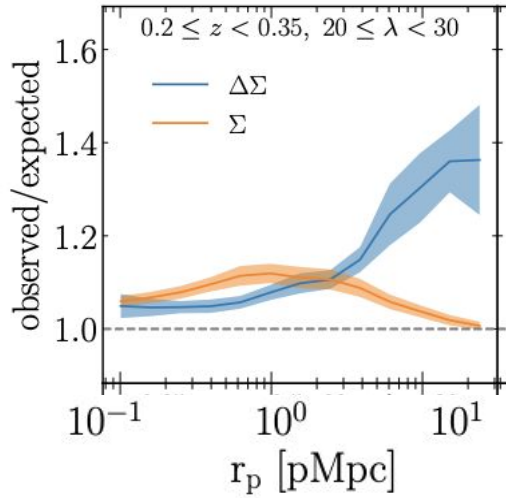
Secondary parameters **fully** explain the covariance

- i.e. Cov remaining = 0

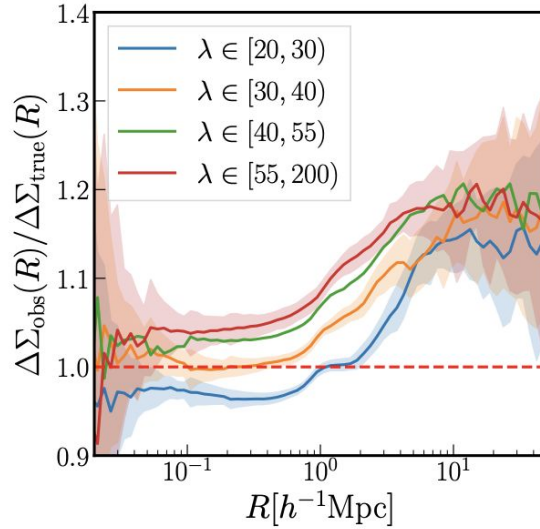
No dominant secondary halo parameter; all noisy and bias indicators of time formation



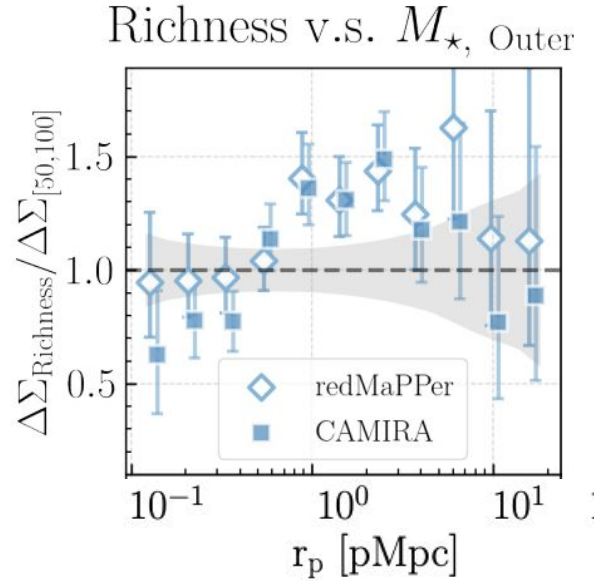
Comparison with other works: Projection effects?



Heidi Wu+2022



Tomomi Sunayama+2020



Song Huang+2021

Takeaways from this project

- Negative covariance at small scales, null at large scales.
- Folds into a mass bias of 2-3% in the halo mass estimates in most bins.
- Dependence with peak height suggests time formation history dependence of the covariance
- Physical origin fully explained by the secondary halo parameter
- Difference between other works likely due to projection effects