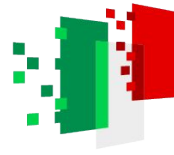




**Finanziato
dall'Unione europea**
NextGenerationEU



Italiadomani
PIANO NAZIONALE
DI RIPRESA E RESILIENZA



DARK ENERGY
SURVEY

**THE EMERGENCE OF THE COSMIC WEB:
LATEST RESULTS FROM THE DES CLUSTER SURVEY**

Matteo Costanzi on behalf of the DES Cluster SWG



**UNIVERSITÀ
DEGLI STUDI
DI TRIESTE**



IFPU - September 2025 | Matteo Costanzi - University of Trieste / INAF

GALAXY CLUSTERS

Illustris TNG simulation

Most massive bound objects in the Universe:

- $R \approx 1 - 5 \text{ Mpc}$
- $M \approx 10^{14} - 10^{15} M_{\odot}$

DARK MATTER

BARYONS

Multi-component systems:

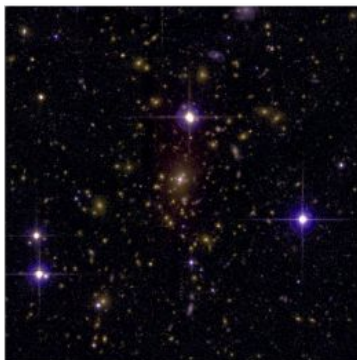
Galaxies and stars (~5%)

ICM (~15%)

DM (~80%)



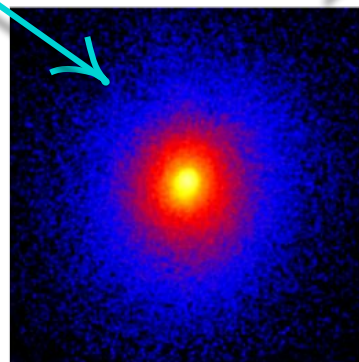
OPTICAL



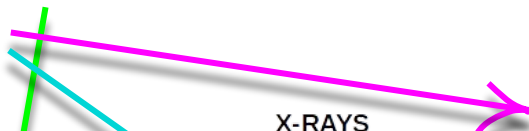
RICHNESS, LENSING EFFECTS



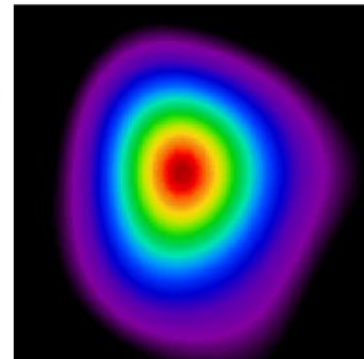
X-RAYS



LUMINOUS AND EXTENDED X-RAY SOURCES



MICROWAVES



SUNYAEV-ZEL'DOVICH EFFECT

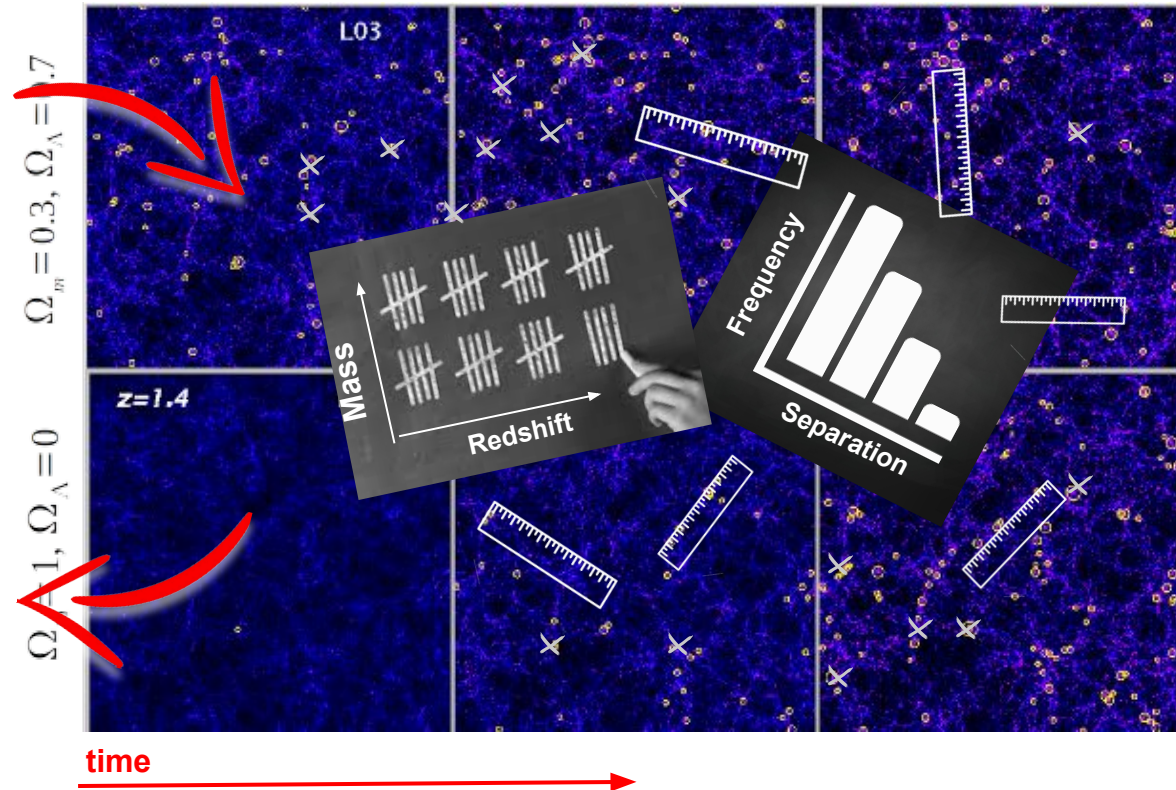
Credit: Allen+11

CLUSTER COSMOLOGY IN A NUTSHELL

The abundance and spatial distribution of galaxy clusters are sensitive to the **growth rate** of cosmic structures and **expansion history** of the Universe

- Amplitude of matter fluctuations, σ_8
- Total matter density, Ω_m
- Dark energy equation of state parameter w
- Total neutrino mass, Σm_ν
- Modified gravity models

...

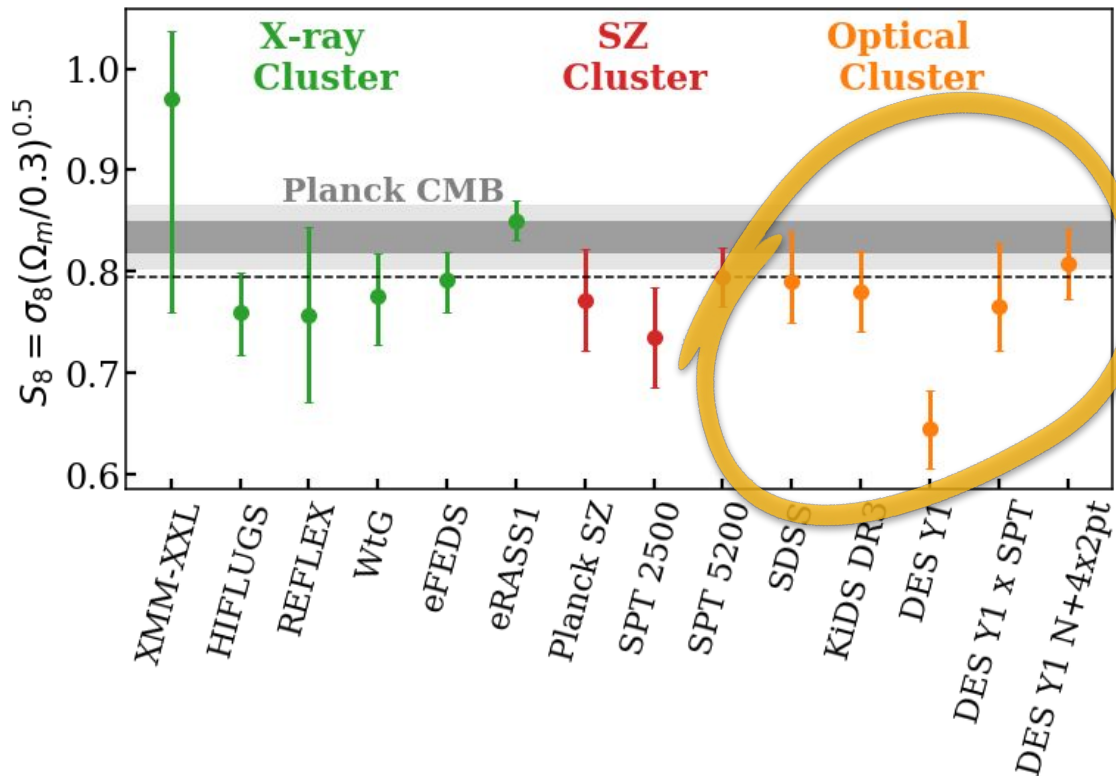


From Borgani, Guzzo 2001

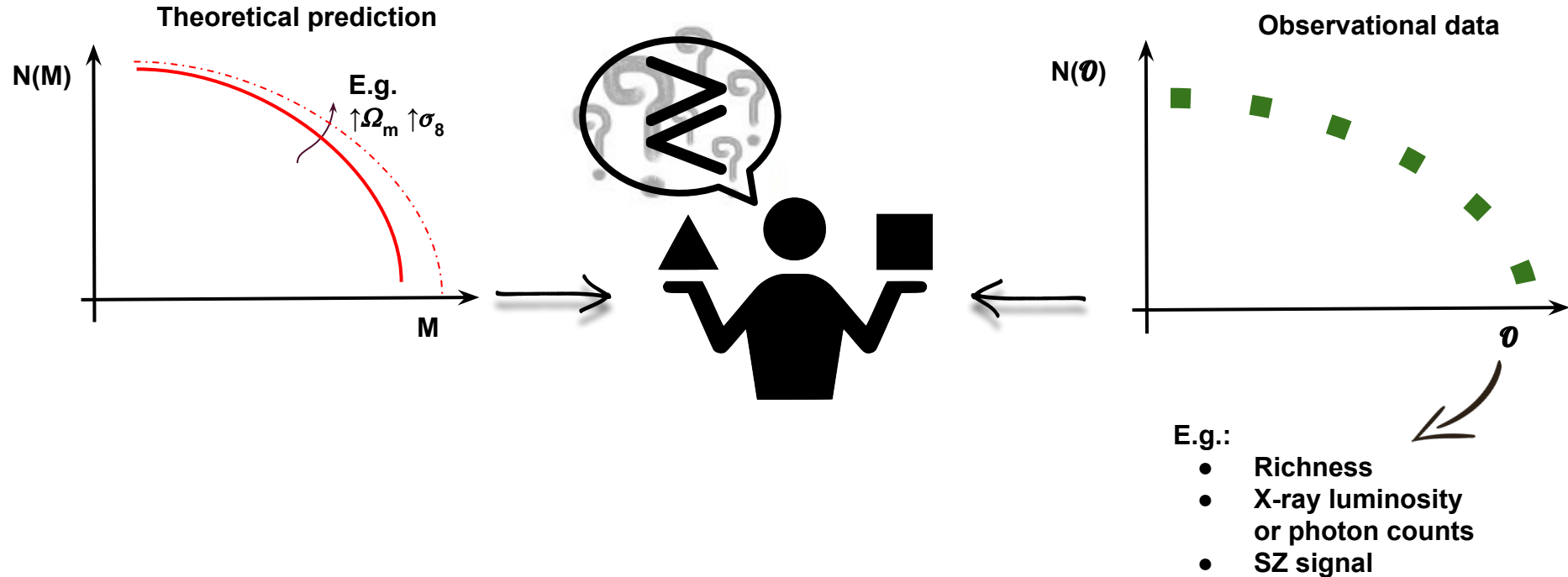
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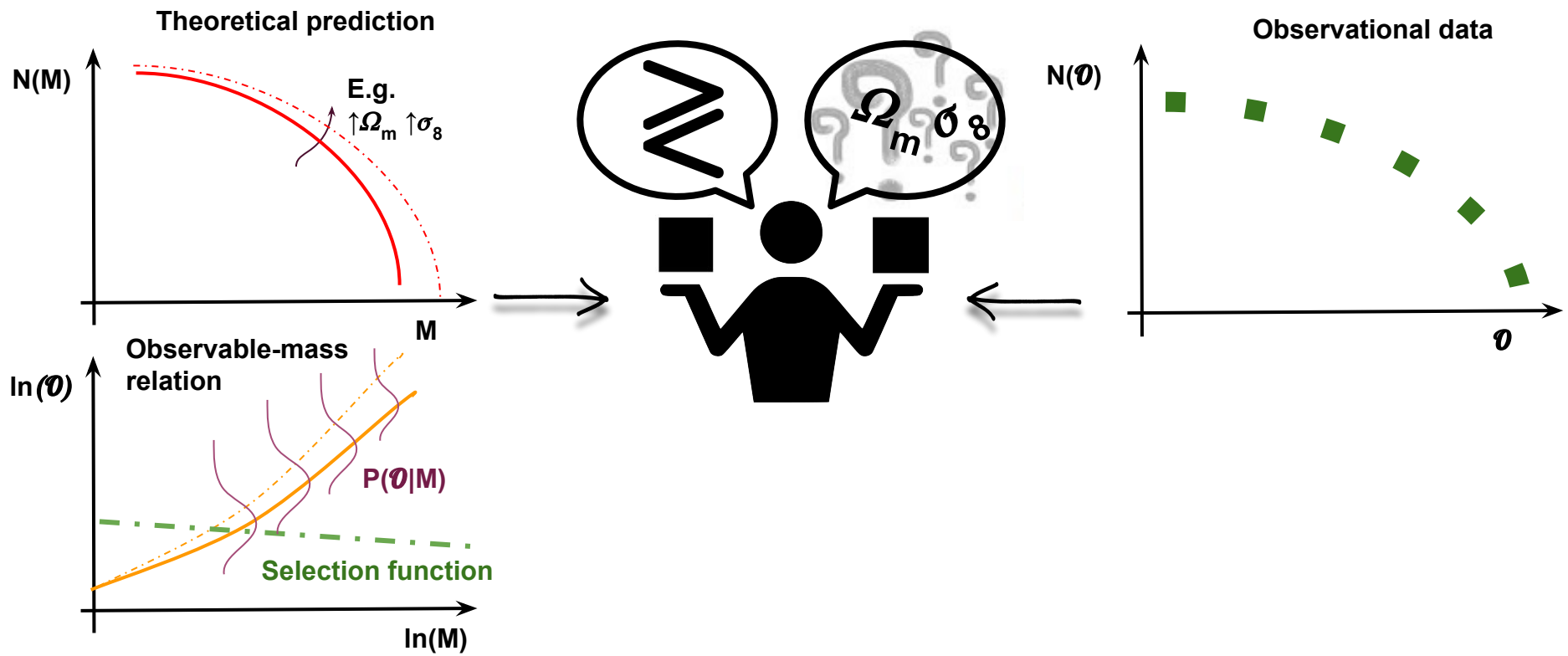
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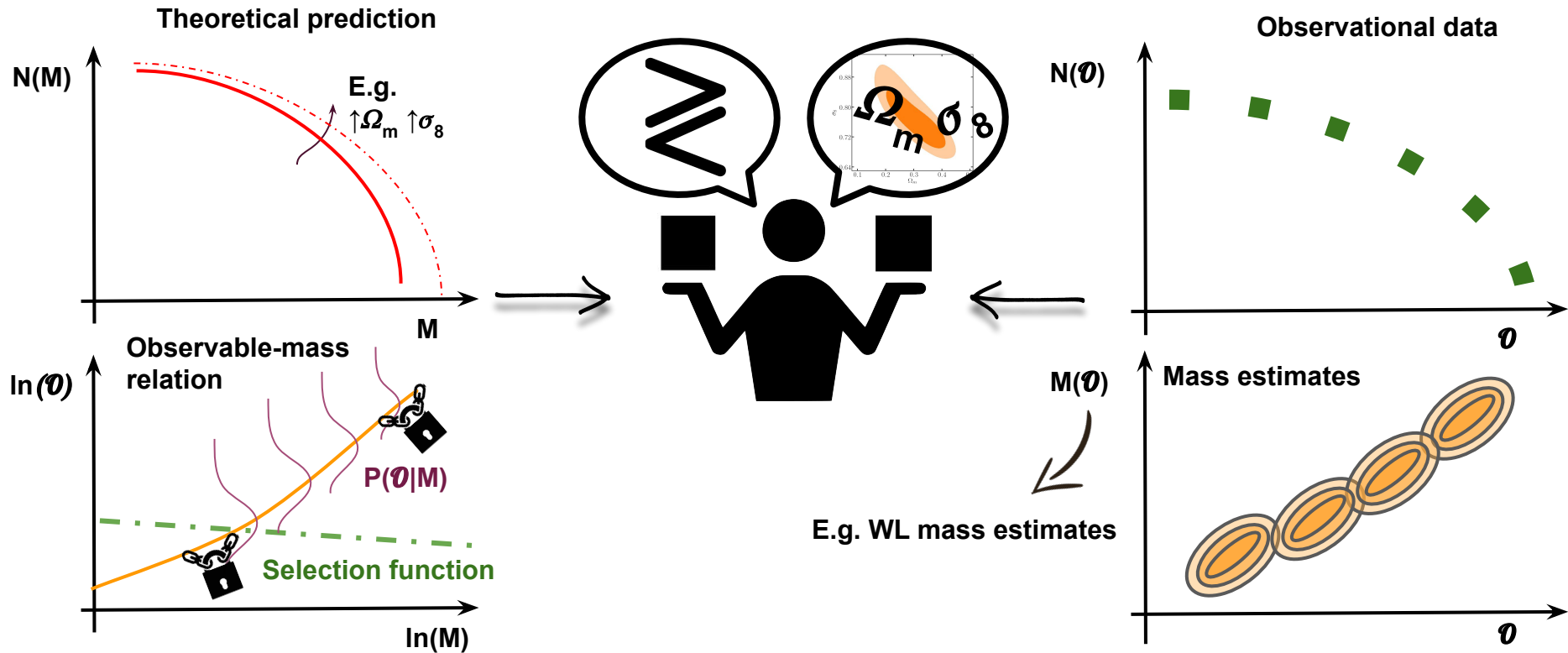
FROM OBSERVATION TO COSMOLOGICAL CONSTRAINTS



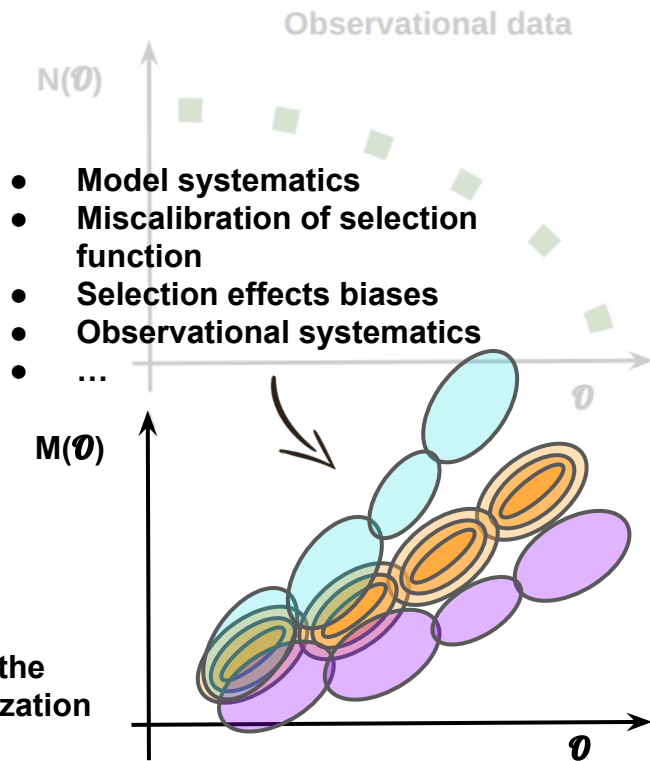
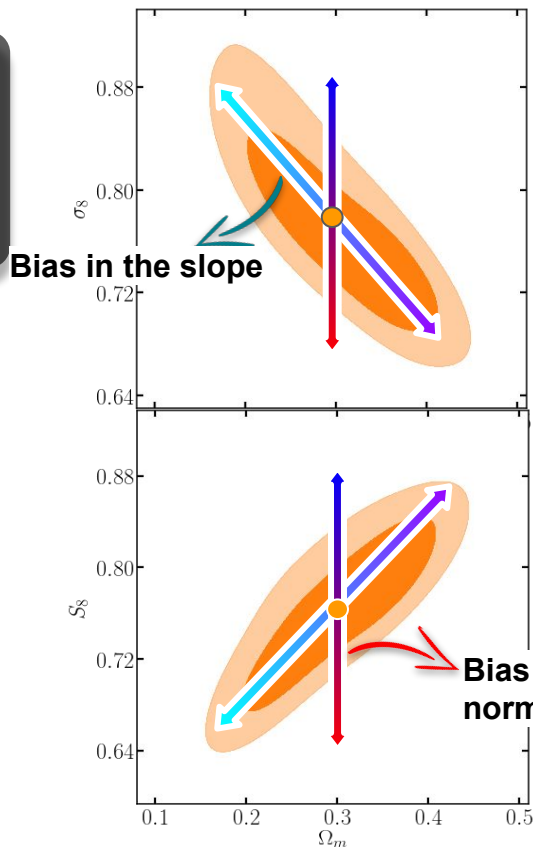
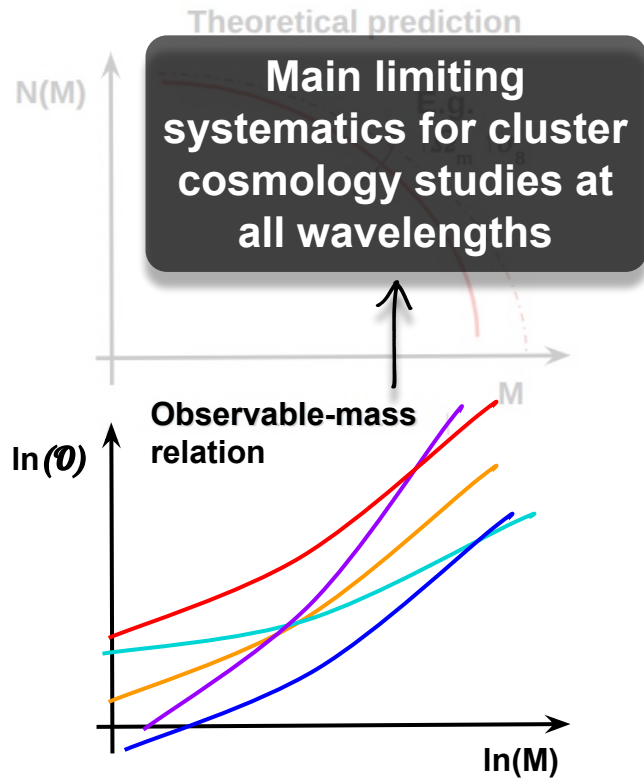
FROM OBSERVATION TO COSMOLOGICAL CONSTRAINTS



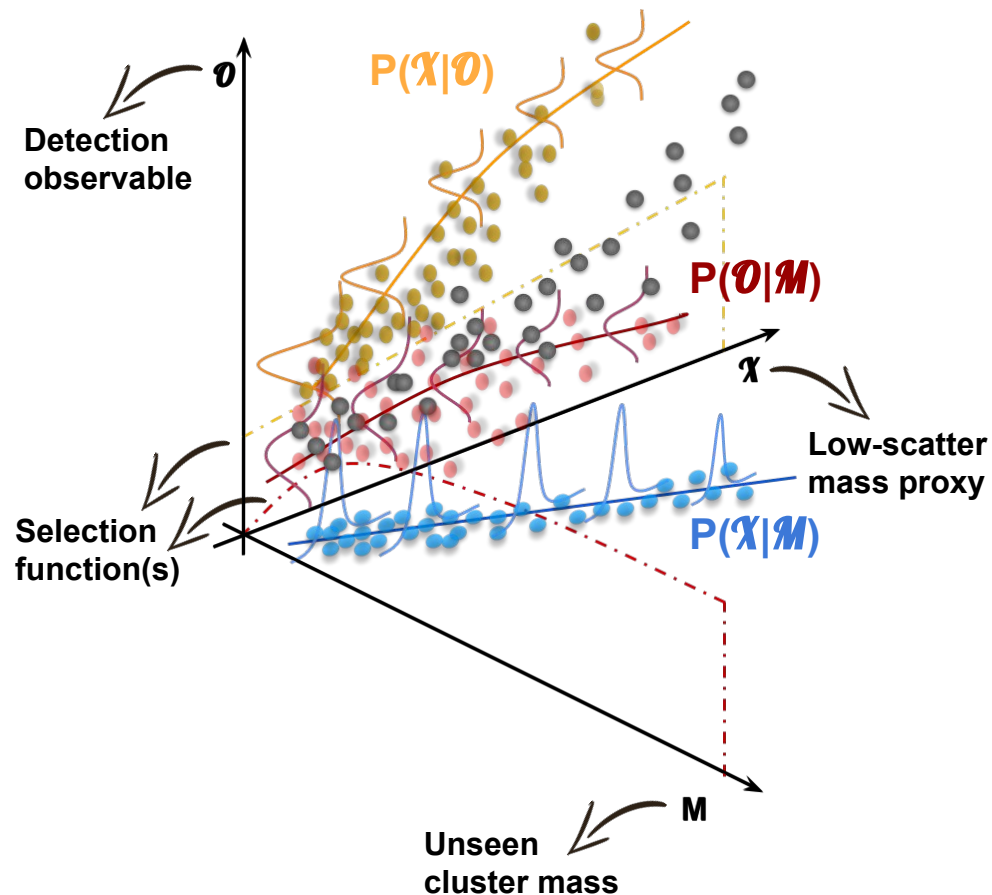
FROM OBSERVATION TO COSMOLOGICAL CONSTRAINTS



MASS CALIBRATION AND COSMOLOGICAL POSTERiors



SELECTION FUNCTION AND MASS CALIBRATION



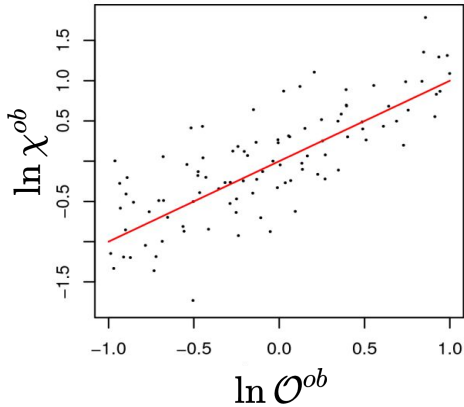
Different detection techniques imply different mass proxies, mass calibration data and systematics.

The calibration of the observable-mass relation(s) requires:

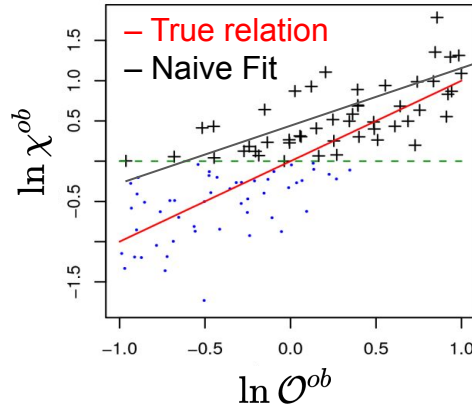
- Well defined selection function(s)
- A model to describe the parent distribution as a function of mass (halo mass function)
- A model to describe the PDF of the multivariate observable space: $P(\chi, O|M)$

SELECTION FUNCTION AND MASS CALIBRATION

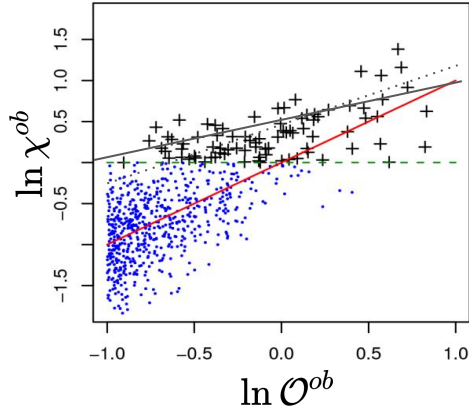
Idealized sample



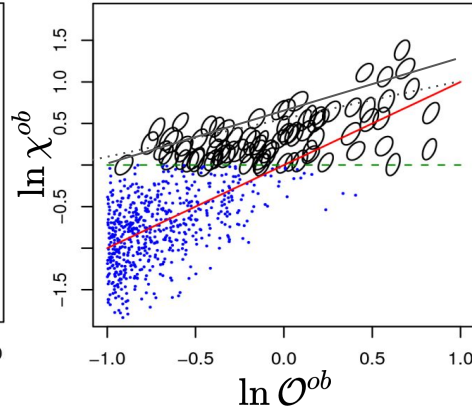
Malmquist bias



Eddington bias



Correlated scatter



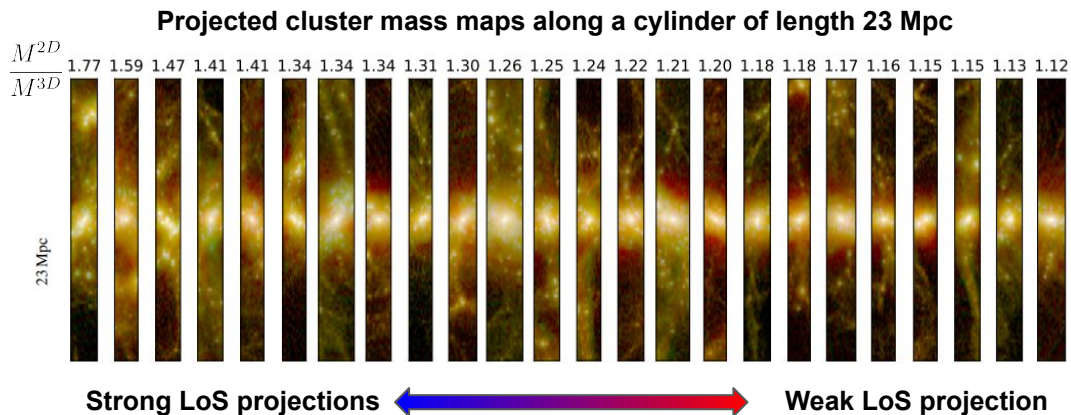
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CORRELATION BETWEEN MULTI- λ OBSERVABLES

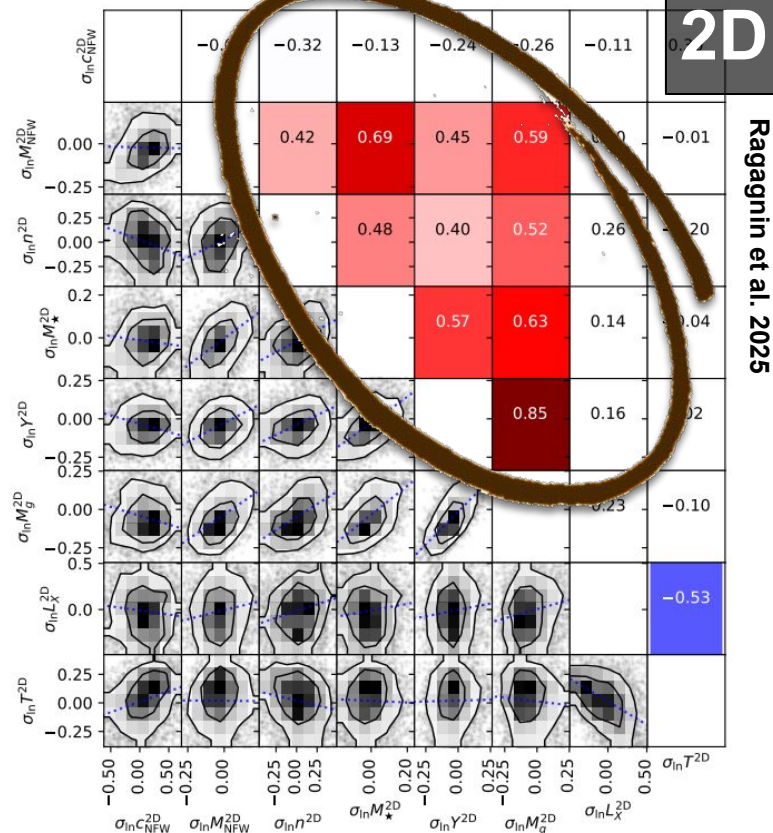
- Observationally, we only have access to projected quantities.



- Line-of-sight projections increase the scatter and skewness of the Obs-Mass relations and introduce correlations between observables measured at different wavelengths

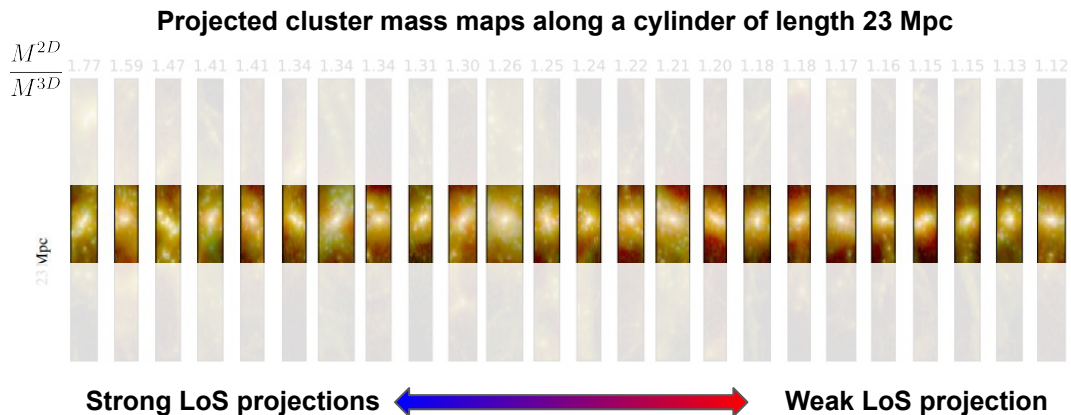
See also e.g. Farahi et al 2019

Correlation coefficients matrix (upper-right triangle) and scatter plot (bottom-left triangle) of log-residual for different 2D observables



CORRELATION BETWEEN MULTI- λ OBSERVABLES

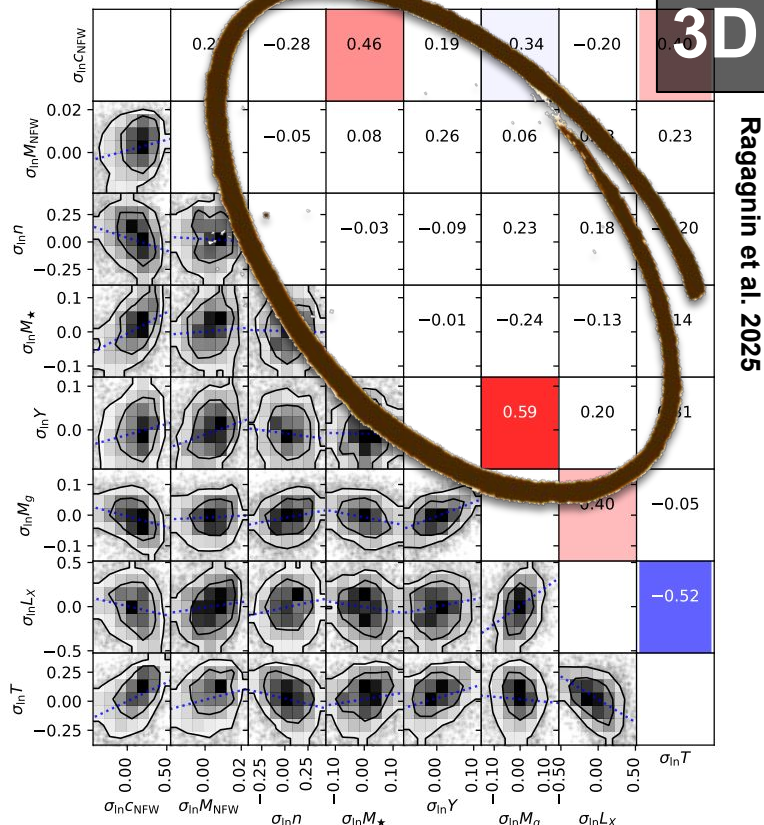
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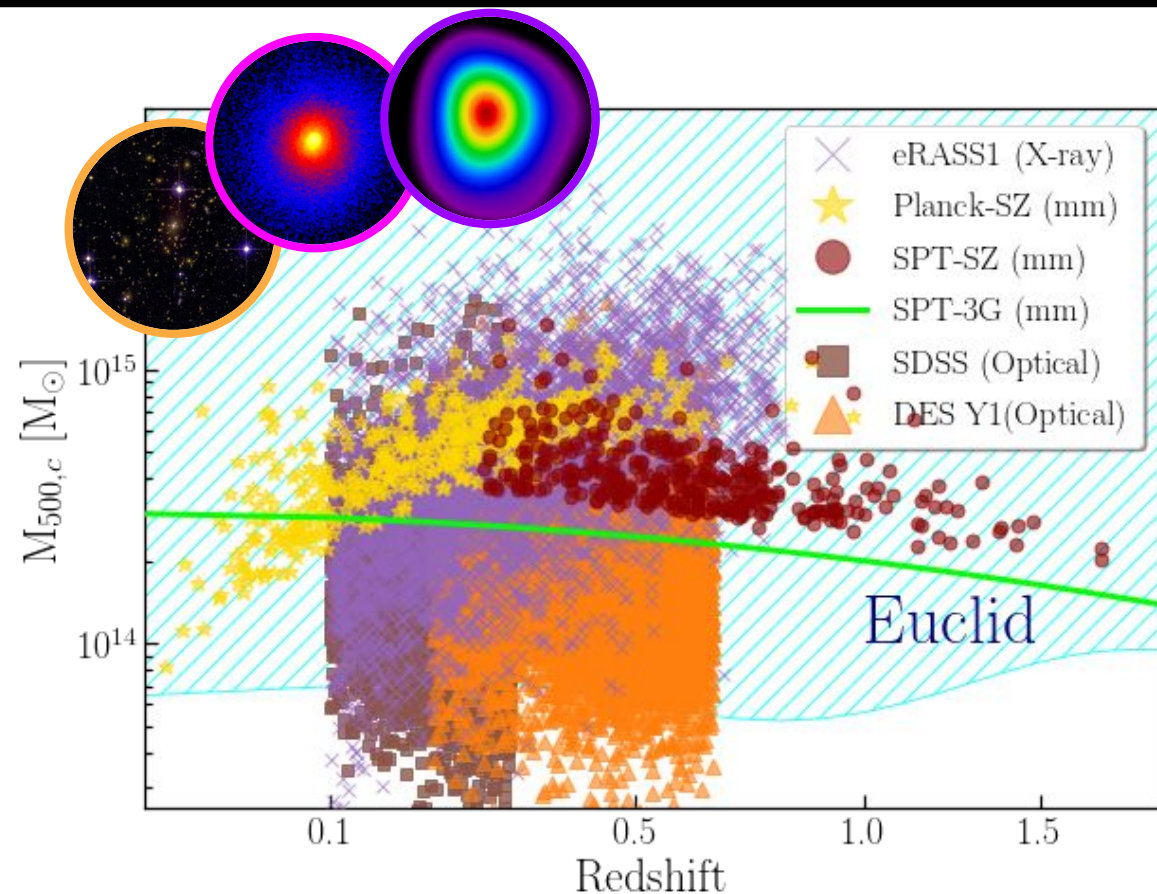
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Correlation coefficients matrix (upper-right triangle) and scatter plot (bottom-left triangle) of log-residual for different 3D observables



CLUSTER CATALOGUES AT DIFFERENT λ s



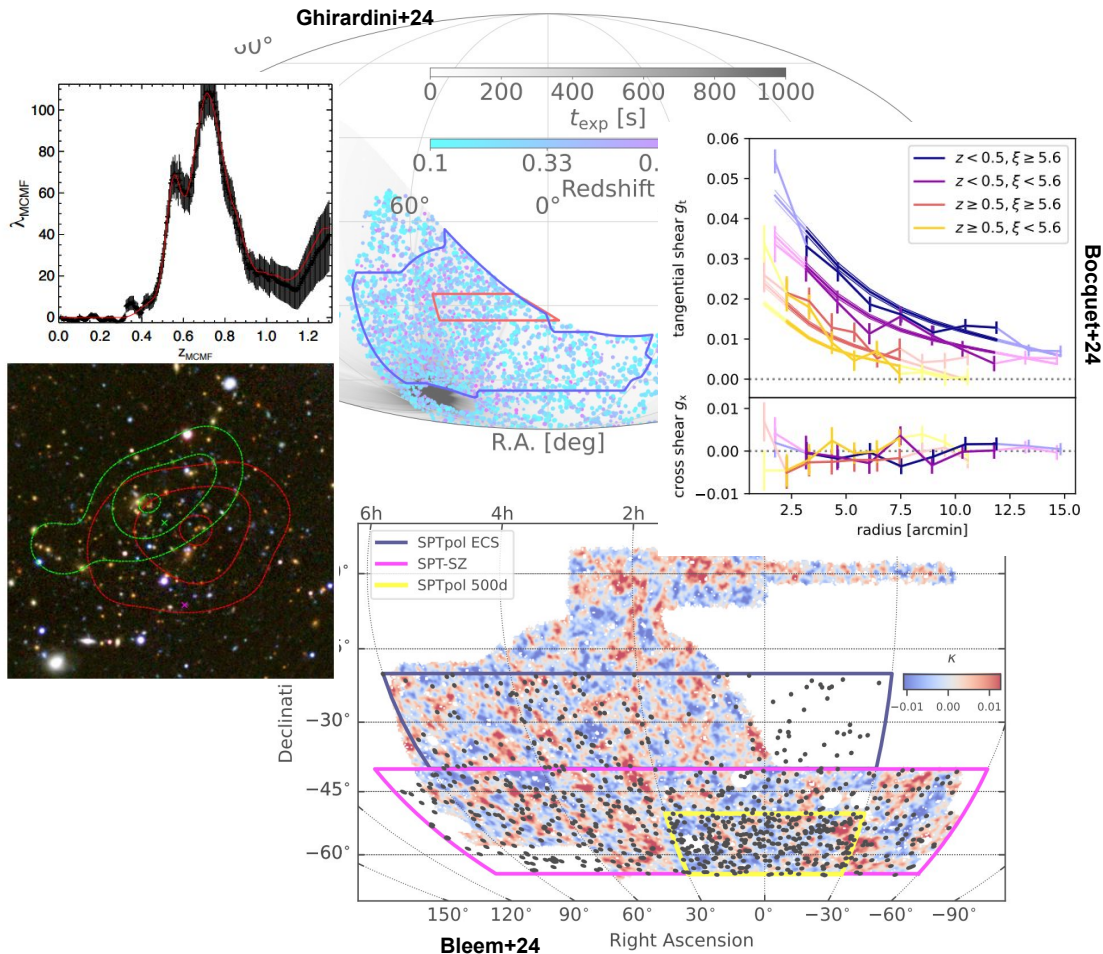
ICM-selected (X-ray, SZ):

- Mass limit $M \sim 2 \cdot 10^{14} M_{\odot}$
- Clean selection function (SZ signal independent of redshift!)
- Need optical follow-up for confirmation, redshift and WL data



Optically-selected:

- Lower mass limit $M \sim 5 \cdot 10^{13} M_{\odot}$ (x10 sample size)
- Selection function harder to model
- WL and photo-z data readily available




CLUSTER CATALOGUES AT DIFFERENT λ s



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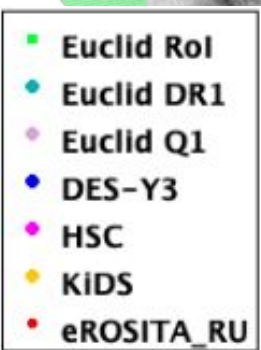
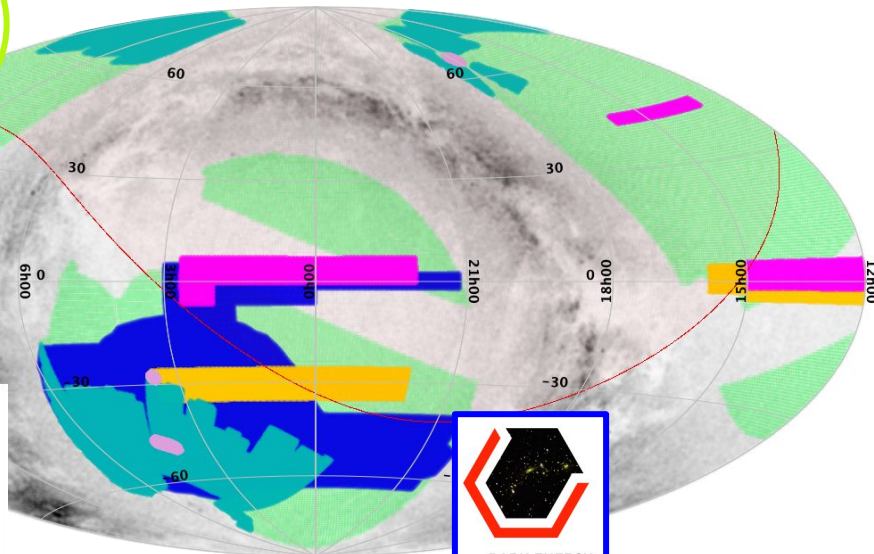
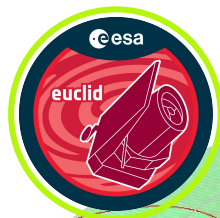
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CLUSTER CATALOGUES AT DIFFERENT λ s

Euclid:

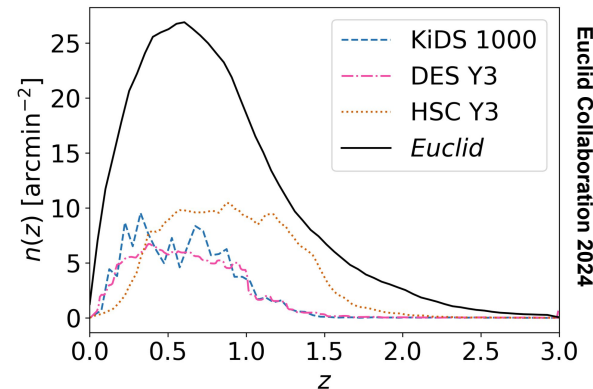
- Optical and IR bands + slitless spectroscopy
- $\sim 15000 \text{ deg}^2$, $0.2 < z < 2.0$ (DR1 $\sim 1700 \text{ deg}^2$)



DES:

- 5 optical bands
- $\sim 5000 \text{ deg}^2$, $0.2 < z < 0.65$ (Y1 $\sim 1500 \text{ deg}^2$)

Source density vs redshift



Optically-selected:

- Lower mass limit $M \sim 5 \cdot 10^{13} M_{\odot}$ (x10 sample size)
- 👍 Selection function harder to model
- 👎 WL and photo-z data readily available

THE DARK ENERGY SURVEY

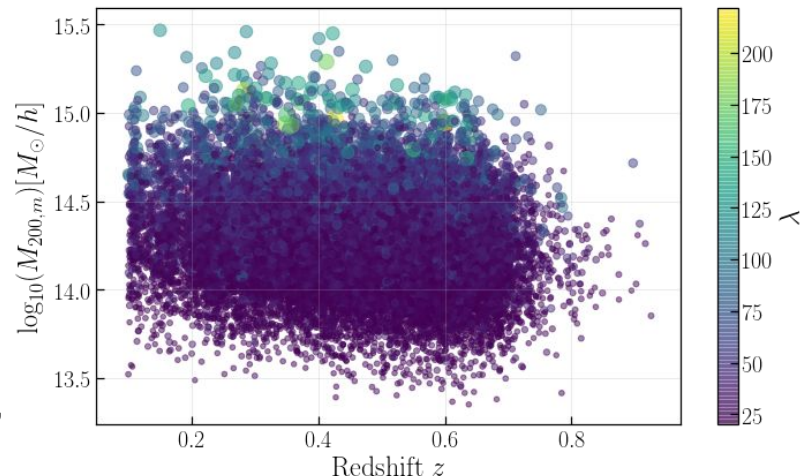
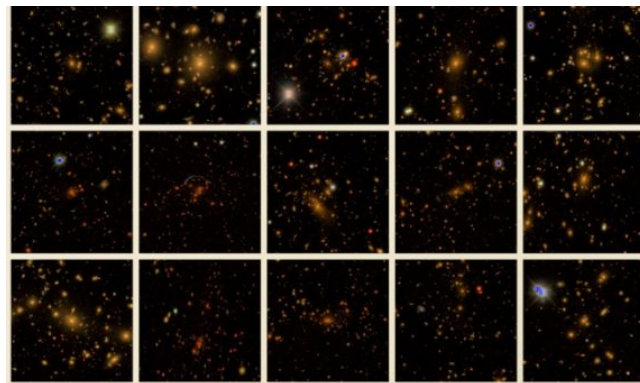
- **DES Photometric Survey:**
 - ~5000 deg² of southern sky
 - $g,r,i,z,(Y)$ bands (mag lim $i\sim 24$)
- **DES Y3 catalog:**
 - **red**-sequence **M**atched-filter **P**robabilistic **P**ercolation cluster finding algorithm (Rykoff+14)

Mass Proxy:
$$\lambda^{\text{ob}} = \sum_{R < R_\lambda} p_{\text{mem}}$$

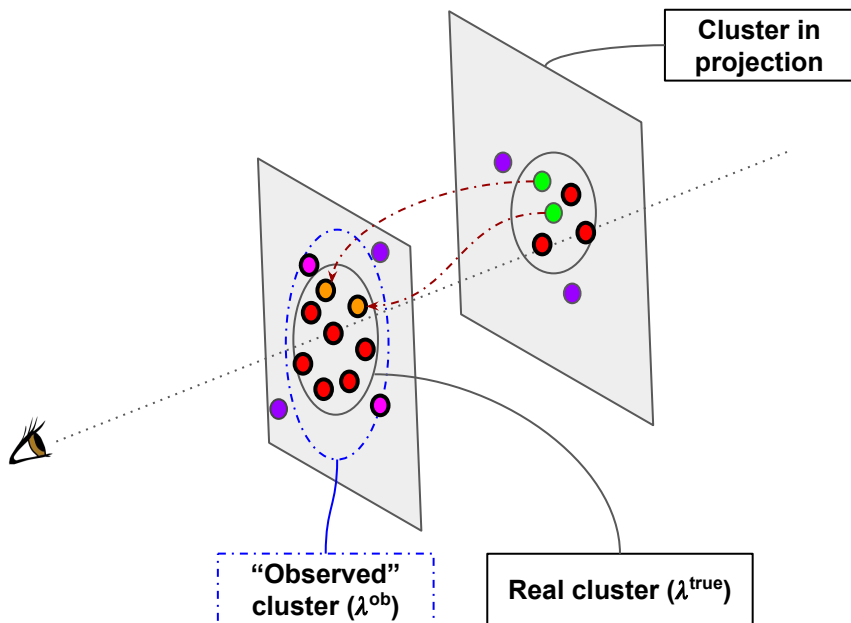
Sub-percent redshift accuracy: $\sigma(z_\lambda)/(1+z_\lambda) \simeq 0.006$

~18k cluster with $\lambda > 20$ and $0.2 < z < 0.65$

Selection function extensively tested in simulation (e.g. Zhang+23, Lee+25, Cao+25) **and vetted with multi-wavelength data** (e.g. Upsdell+23, Kelly+24, Grandis+25, Myles+25, Giles+in prep)



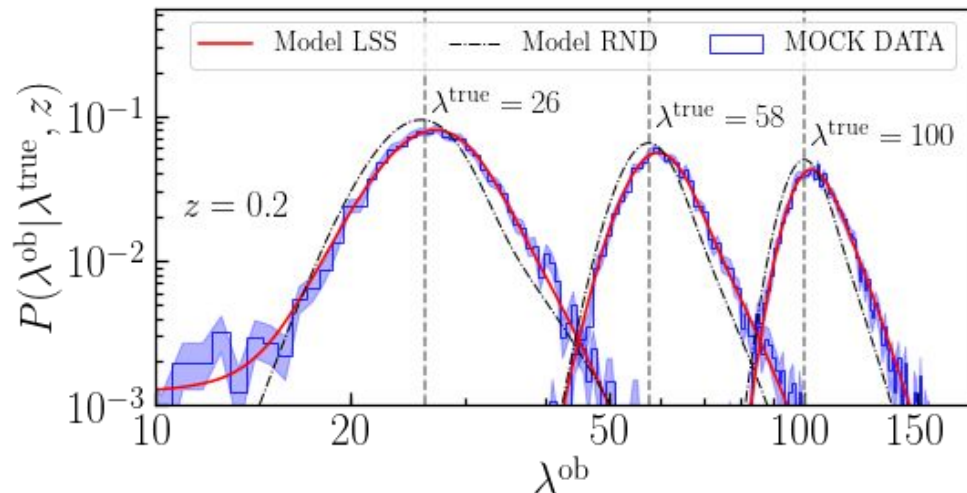
redMaPPer DES SIMULATION TESTS



$$\lambda^{\text{ob}} = \lambda^{\text{true}}(\mathbf{M}) + \delta\lambda(\lambda, \dots)$$

$$\downarrow$$
$$\Delta^{\text{bkg}} + \Delta^{\text{prj}} + \Delta^{\text{perc}}$$

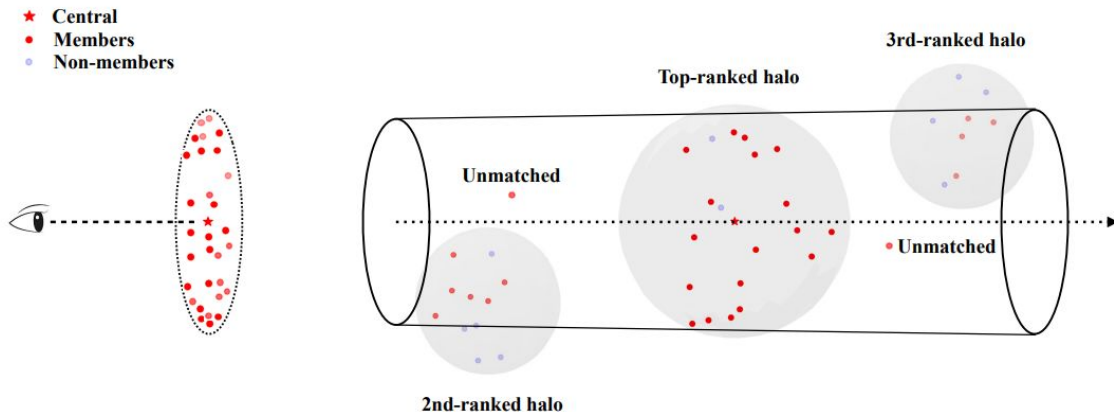
Scatter between true and observed richness calibrated via mock/data analysis



Costanzi et al. 2019

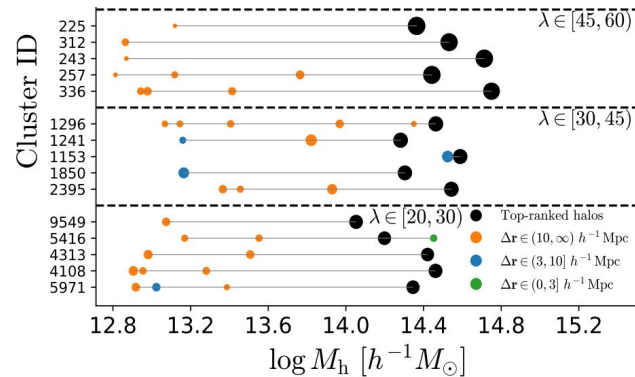
See also: Lee et al. 2025

redMaPPer DES SIMULATION TESTS

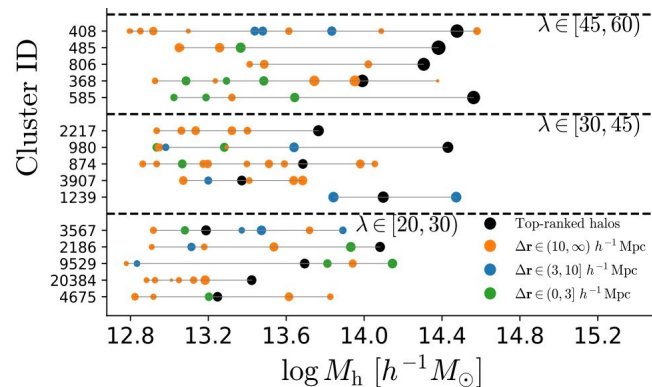


Examples of halos matched to a cluster:

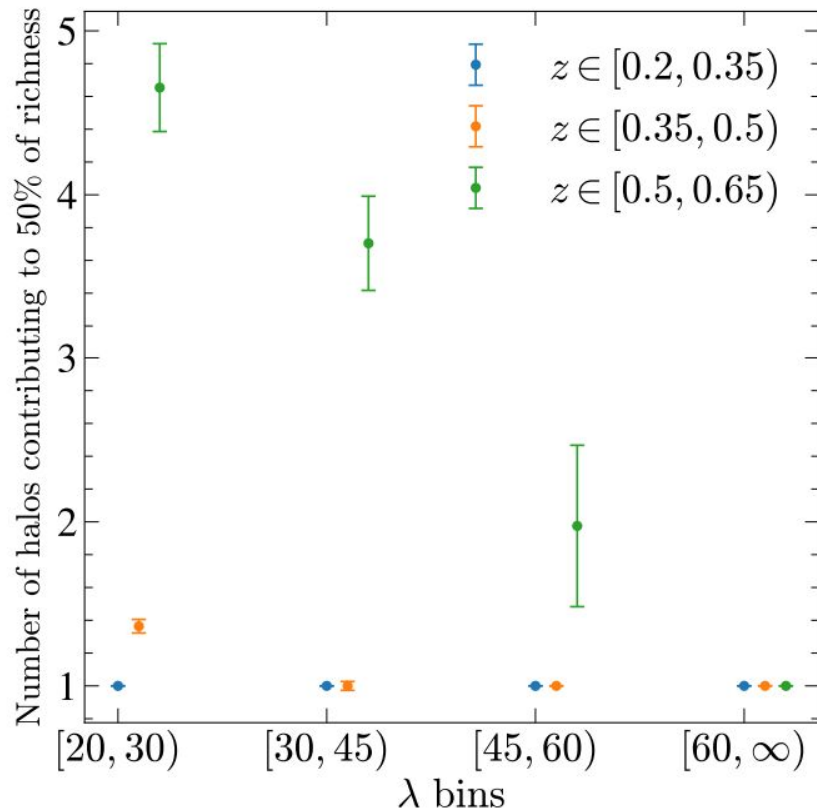
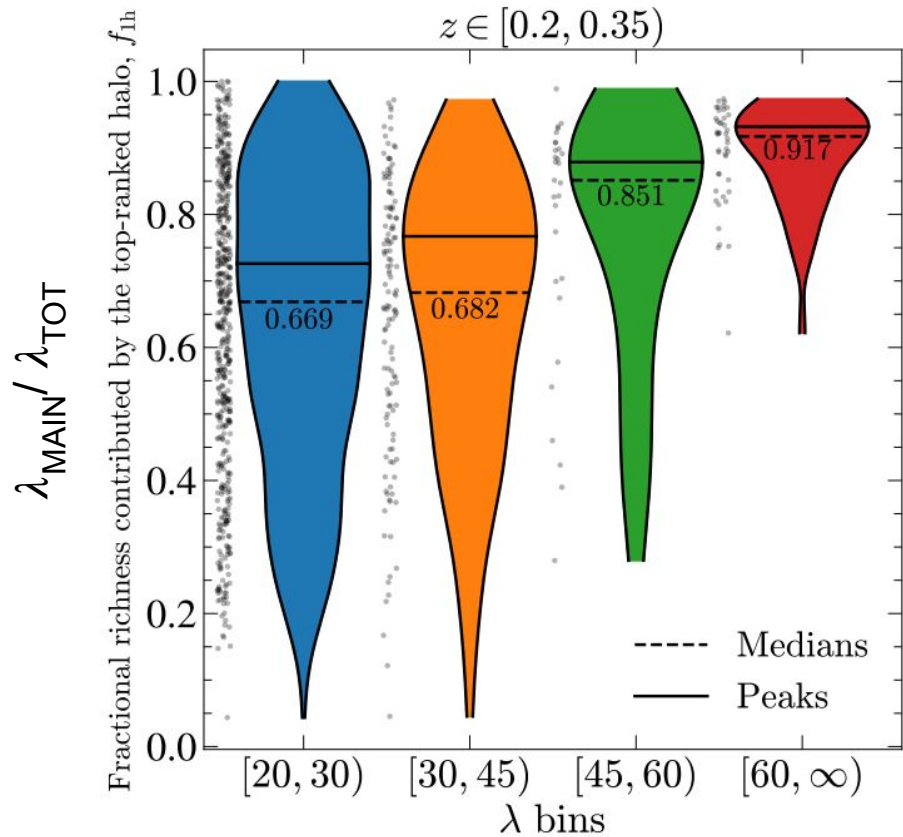
Typical clusters



Heavily projected

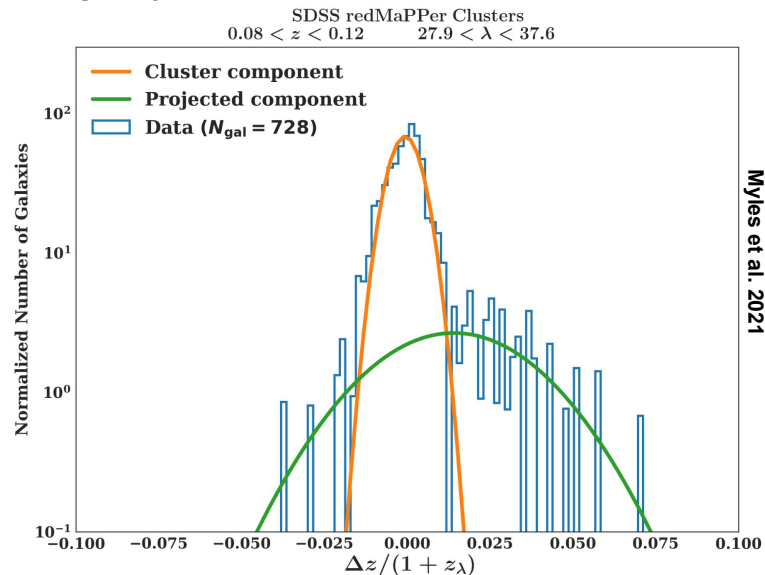


redMaPPer DES SIMULATION TESTS

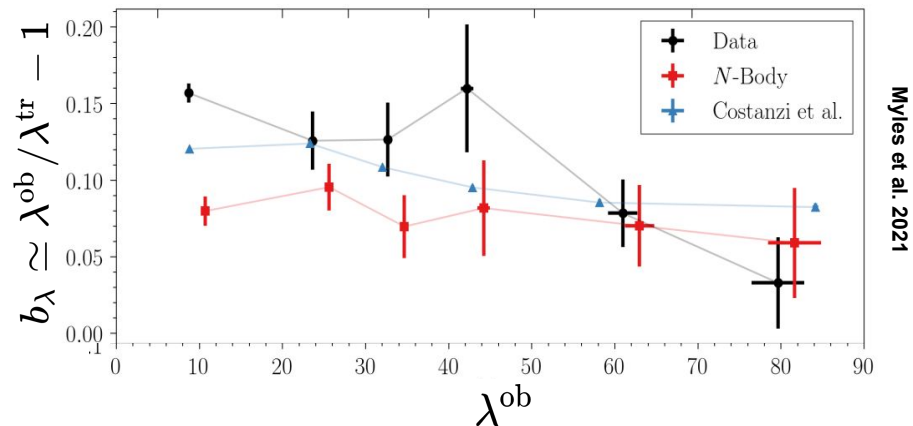


- Spectroscopic data of putative cluster members allow to distinguish between a population of true cluster galaxies and projected interlopers

Member galaxy redshift distribution from stacked spec-z data



Fraction of λ contributed by contaminants:
 Spec-z data vs simulation

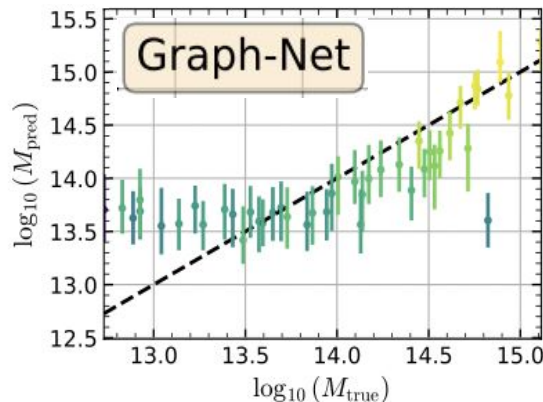
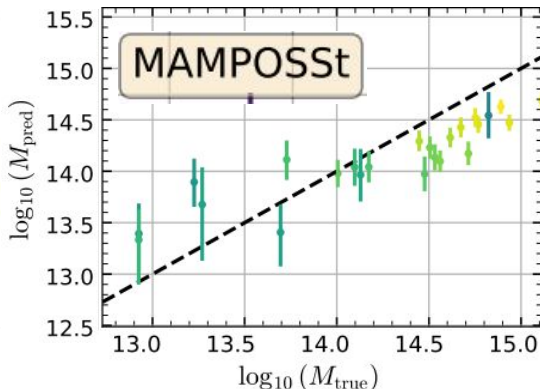
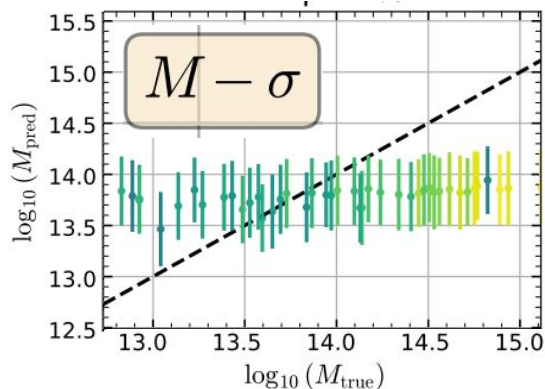


See also: Myles et al. 2025

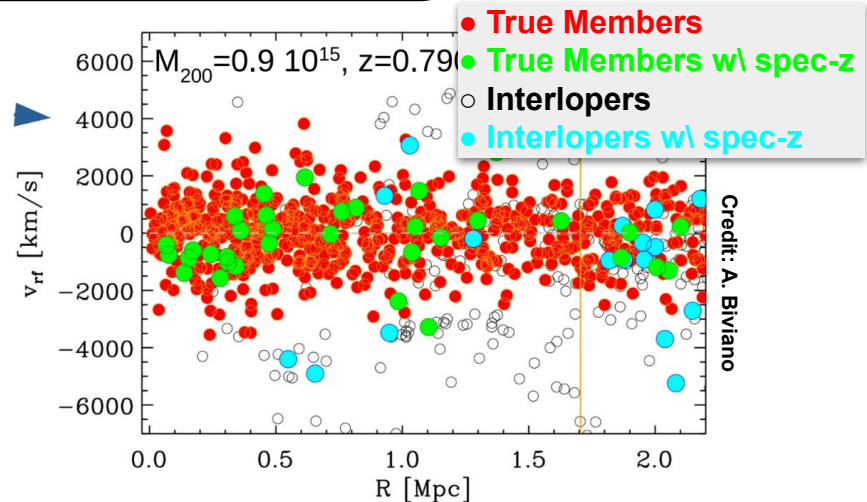
MASS CALIBRATION WITH SPEC-Z

- Euclid slitless spectroscopic data can be used to improve redshift estimates, and calibrate cluster masses in the redshift range $0.9 < z < 1.8$.
- Low completeness and biased population of tracers prevent the use of traditional methods to derive dynamical masses

Machine Learning based estimates (Ho et al in prep.)

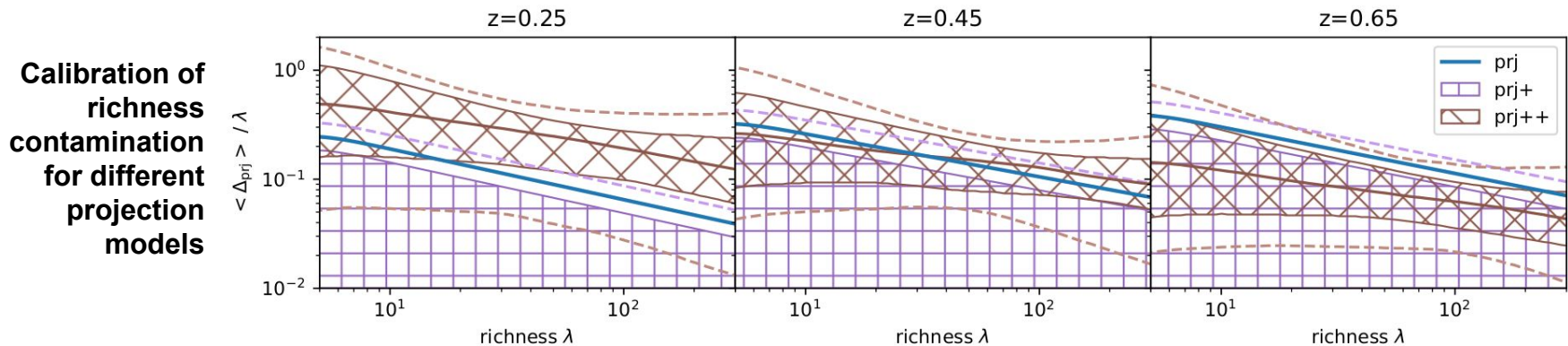
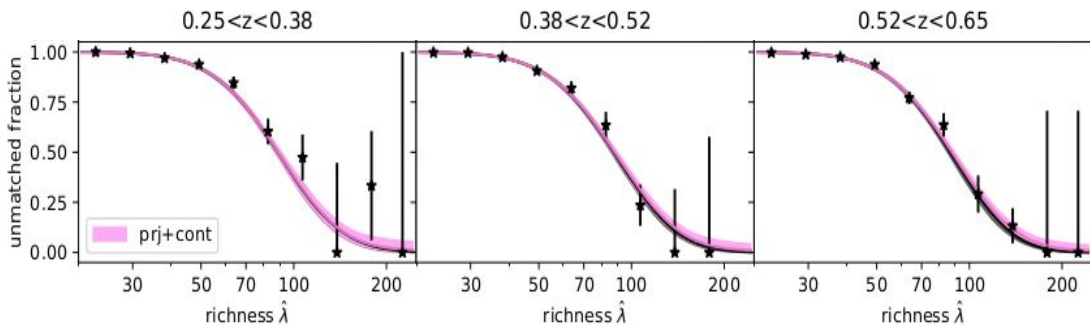
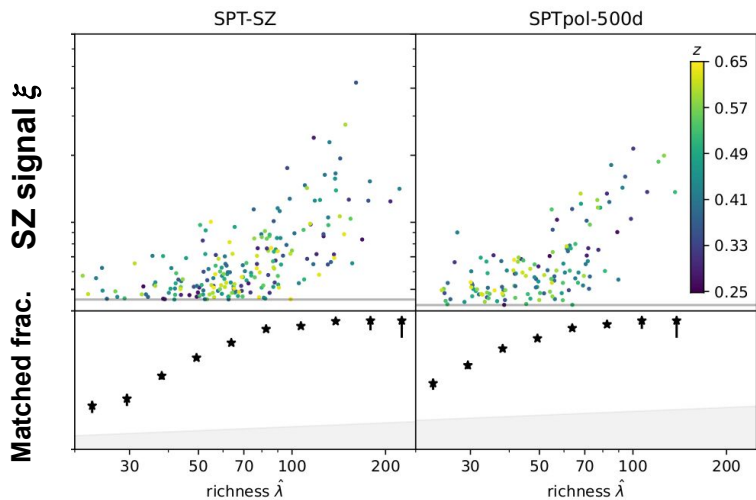


Ho et al. in prep



$\delta\lambda$ CALIBRATION: SZ DATA

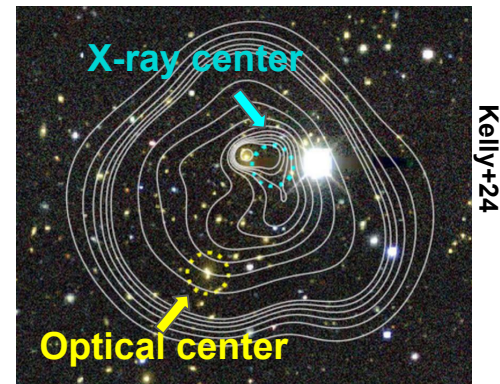
- Use redMaPPer DES Y3 x SPT-SZ/500d/ECS matched and unmatched sample to calibrate projection effects: (Grandis et al 2025; see also Grandis+21)



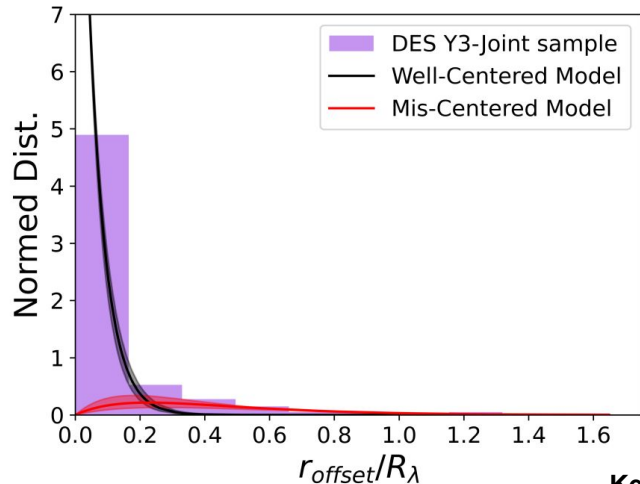
CLUSTER MISCENTERING: X-RAY CALIBRATION

Cluster miscentering caused by: masked data, merging/disturbed clusters, “blue” BCG

Miscentering tends to bias low the lensing signal and other cluster observables (e.g. richness)

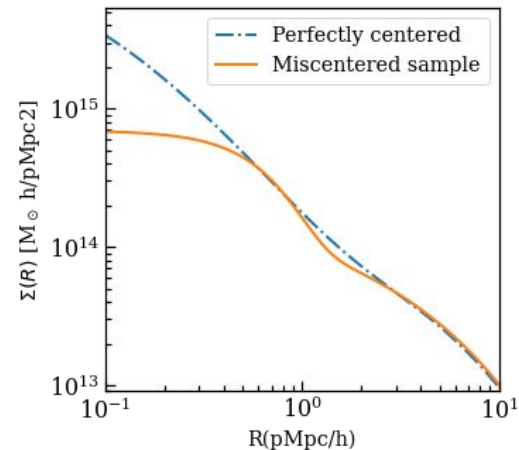
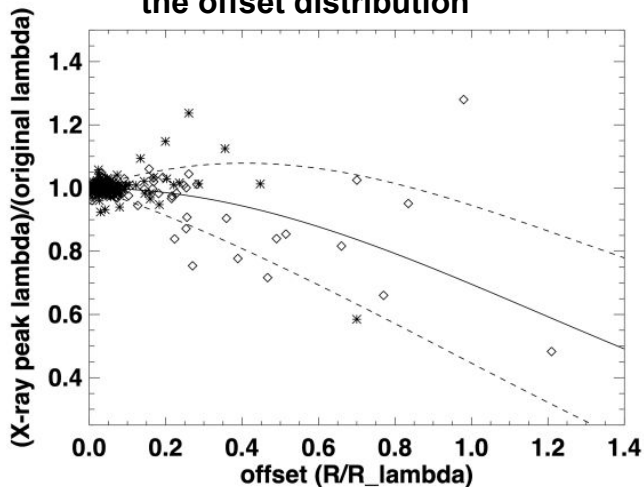


Radial offset distribution calibration using X-ray vs optical center



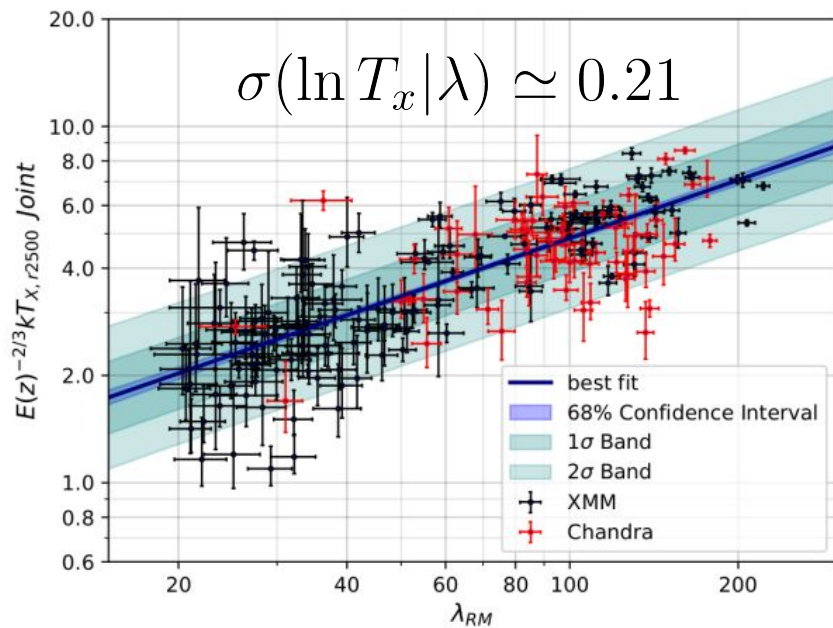
Kelly+24

Richness perturbation as a function of the offset distribution

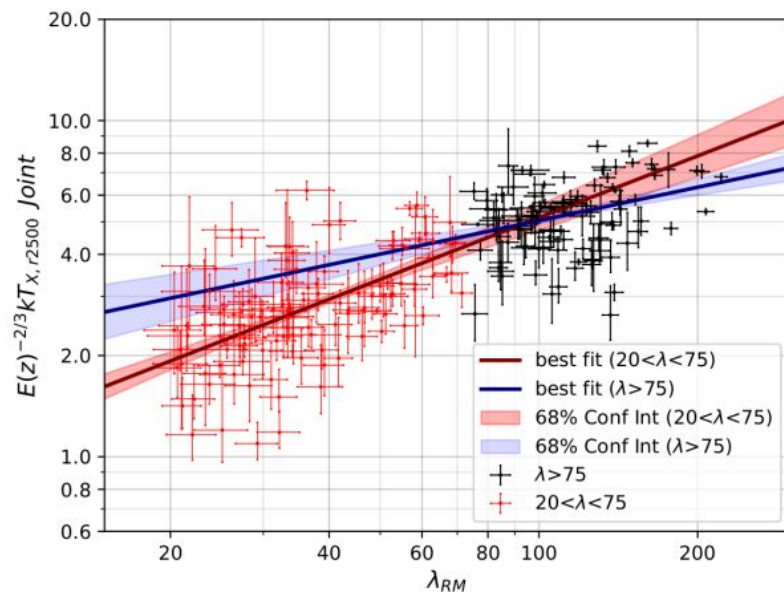


OPTICAL vs X-RAY OBSERVABLES

$T_x - \lambda$ relation



$T_x - \lambda$ relation: different λ bins



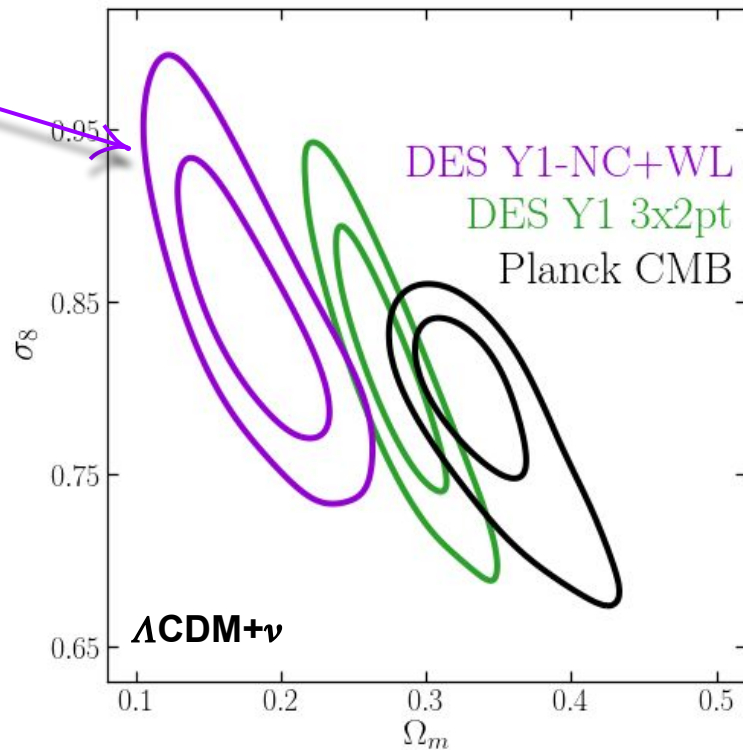
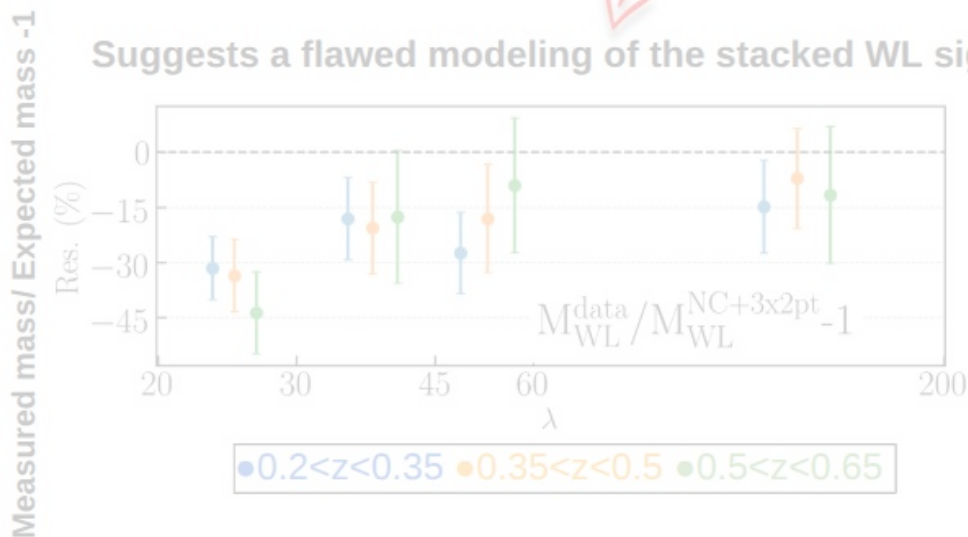
Kelly+24

SELECTION EFFECT BIAS: LESSON FROM DES Y1

DES Y1 NC+WL mass calibration from stacked shear profiles below 30 Mpc (DES collaboration 2020)

- 2.4σ tension with DES Y1 3x2pt
- 5.6σ tension with Planck 18

Suggests a flawed modeling of the stacked WL signal

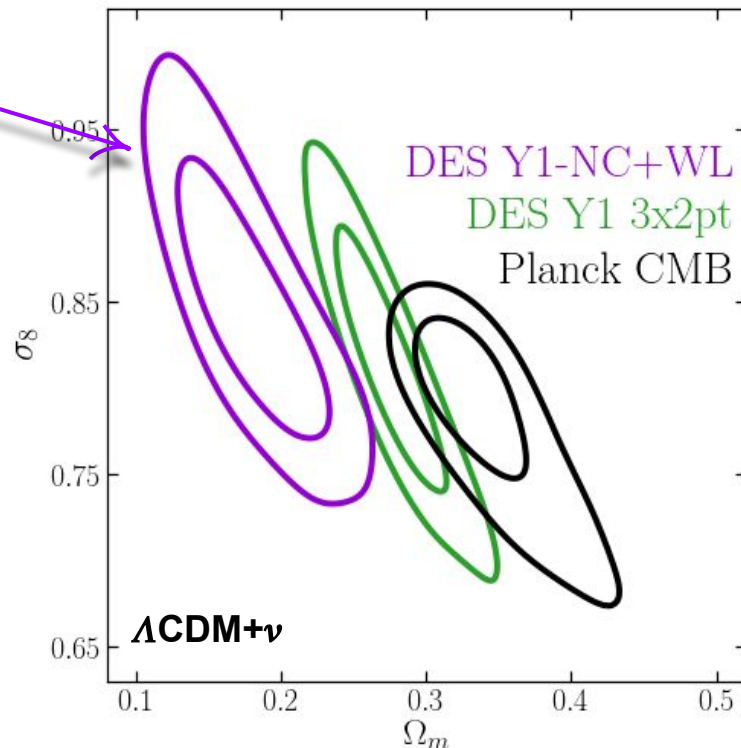
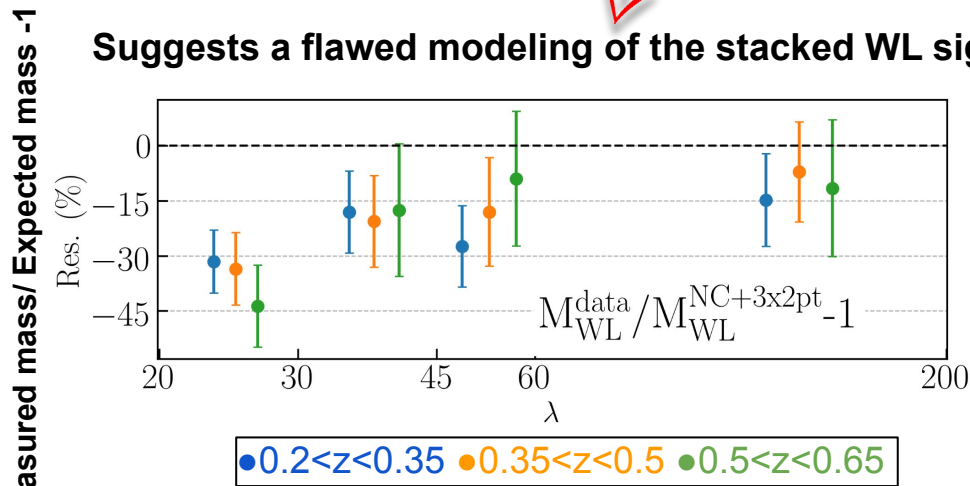


SELECTION EFFECT BIAS: LESSON FROM DES Y1

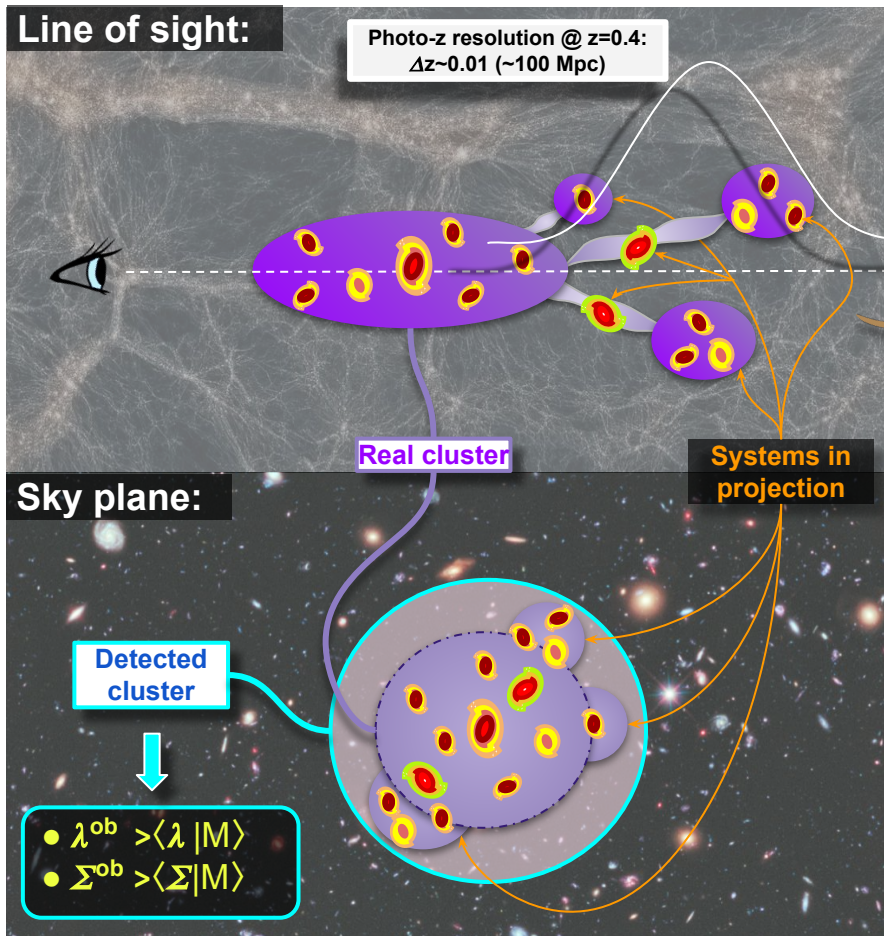
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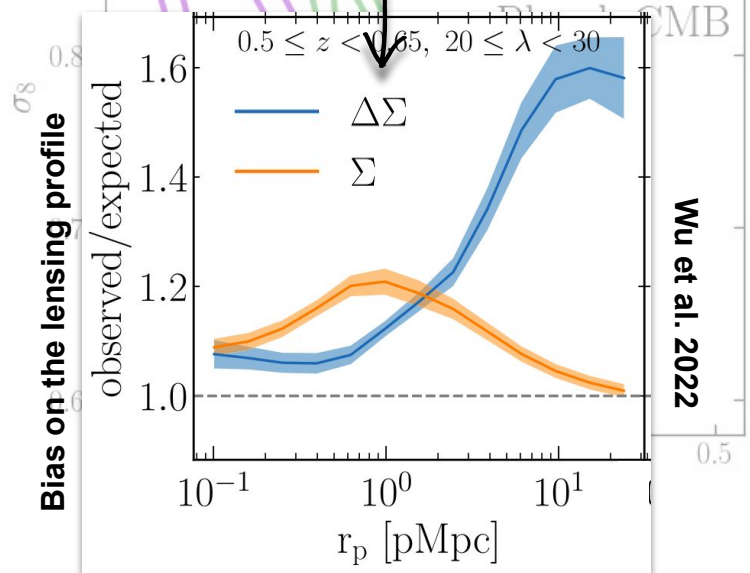


SELECTION EFFECT BIAS: LESSON FROM DES Y1



$$\lambda^{\text{ob}} = \lambda(M) + \delta\lambda(\lambda, \dots)$$

$$\Sigma^{\text{ob}} = \Sigma(M) + \delta\Sigma(\delta\lambda, \dots)$$

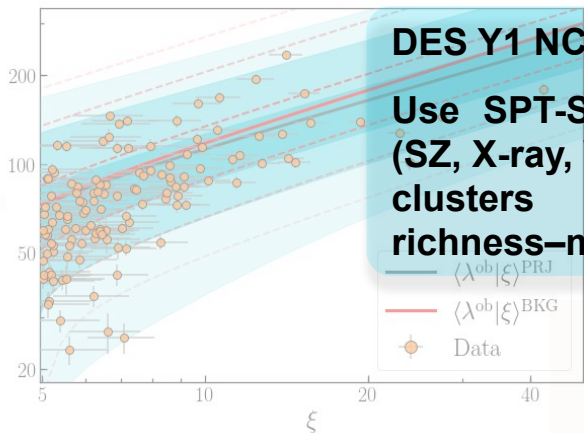
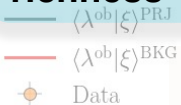


See also Sunayama+2020

SELECTION EFFECT BIAS: LESSON FROM DES Y1

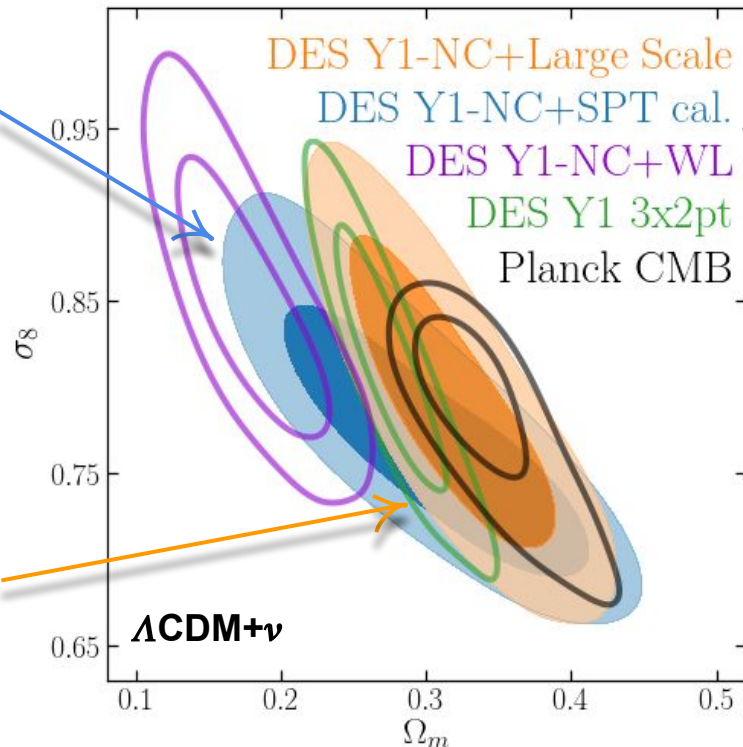
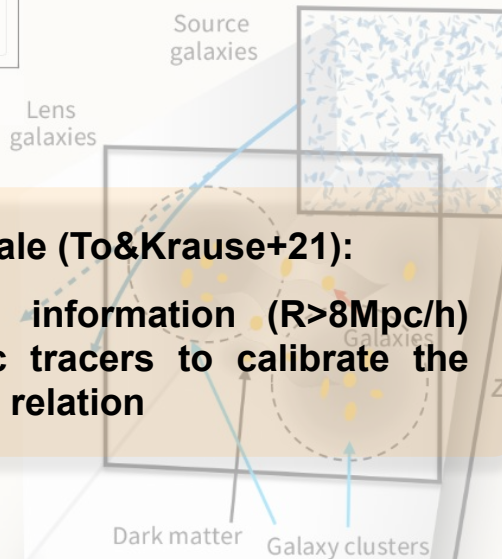
DES Y1 NC X SPT data (Costanzi+21):

Use SPT-SZ multi-wavelengths data (SZ, X-ray, WL) of cross-matched DES clusters to constrain the richness-mass scaling relation



DES Y1 NC x Large Scale (To&Krause+21):

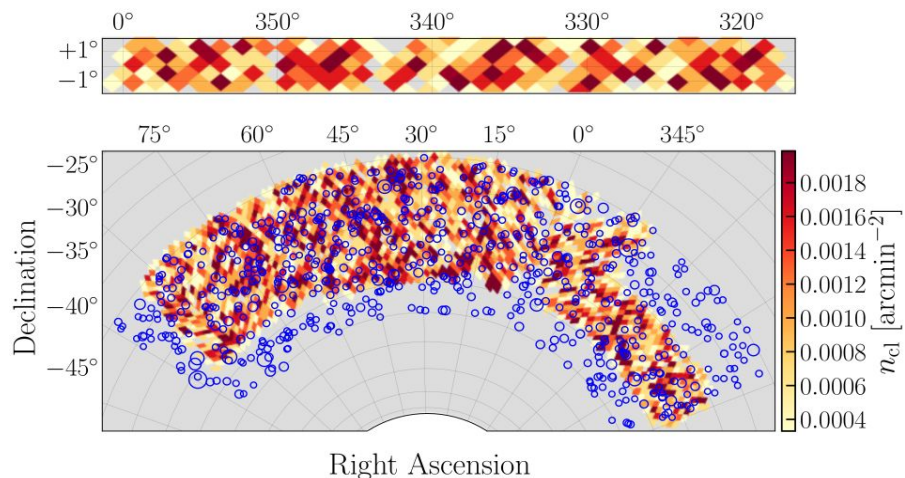
Use only large-scale information ($R > 8 \text{ Mpc}/h$) from different cosmic tracers to calibrate the richness-mass scaling relation



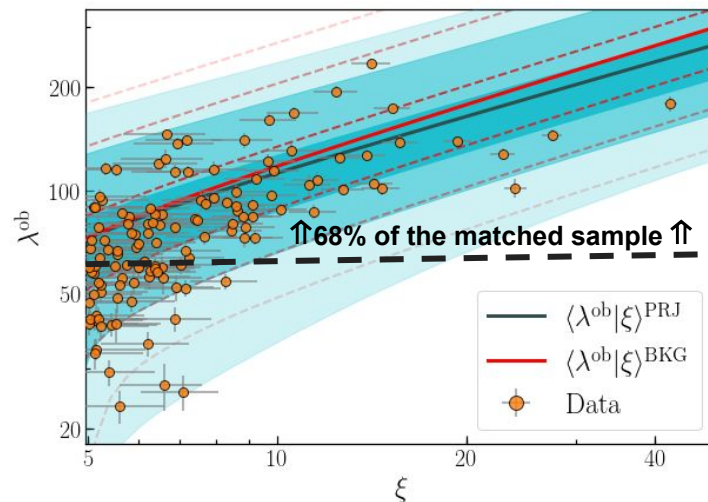
DES Y1 CLUSTER COUNTS x SPT MULTI- λ DATA

- Idea: Remove DES WL data and use SPT-SZ multi-wavelengths data (SZ, X-ray, WL) to constrain the richness–mass scaling relation
- Use DES Y1 Number Counts to constrain cosmology
- Add high- z SPT NC to test consistency between abundance and follow-up data sets and assess possible cosmological gain

DES Y1 cluster density and SPT-SZ clusters



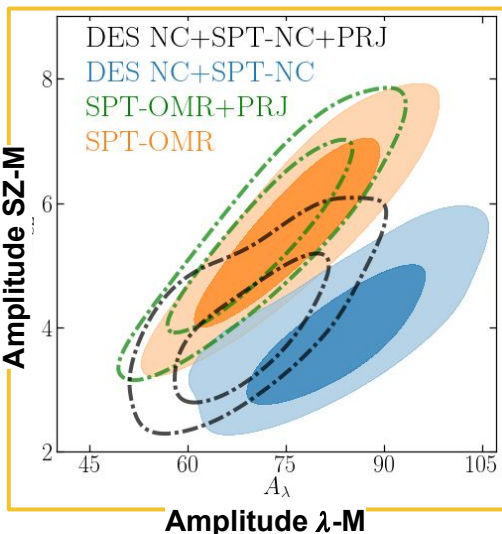
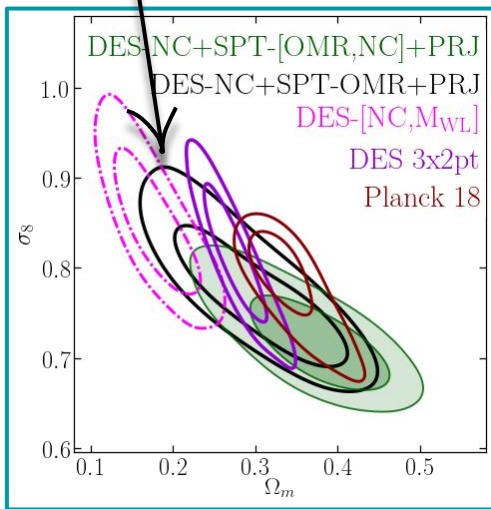
DES Y1-SPT SZ cross matched sample



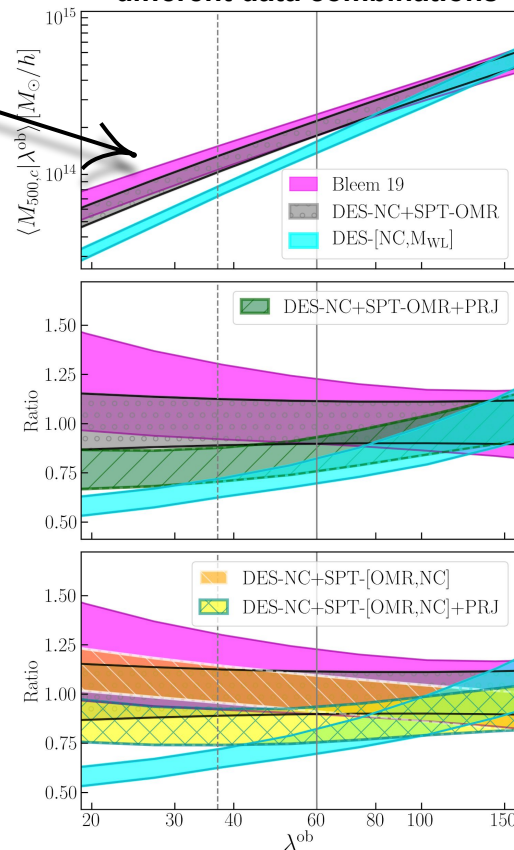
DES CLUSTER COUNTS x SPT MULTI- λ DATA

DES-NC x SPT-multi- λ yields results consistent with multiple cosmological probes.

Inclusion of high-redshift SPT NC data serves as a test of different scatter models for λ^{ob}



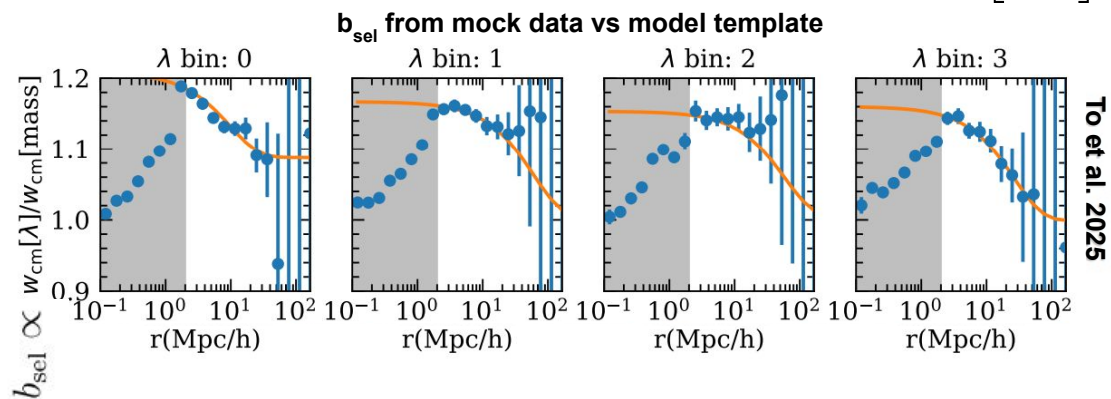
Mass-richness relations for different data combinations



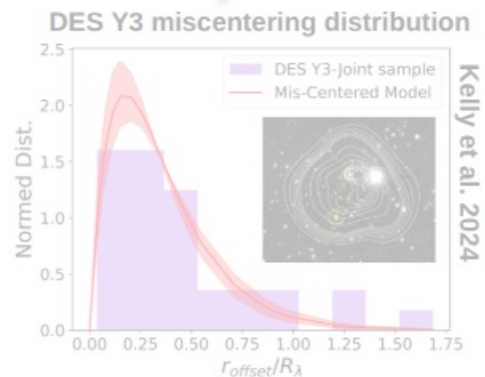
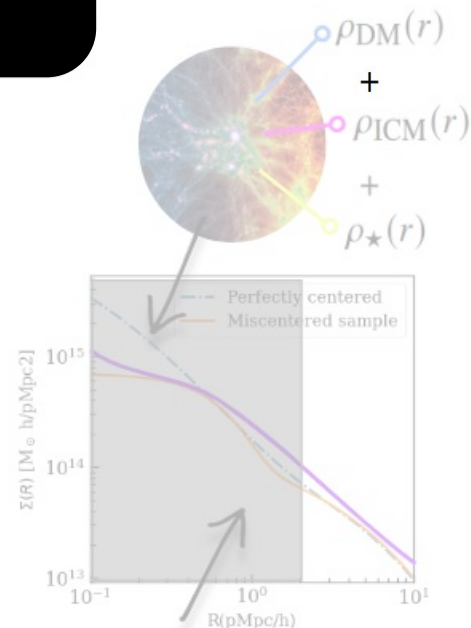
CLUSTER COUNTS x LARGE SCALE TRACERS

By dropping small-scale data we get:

- **Simpler model for selection bias:** $b_{\text{sel}} \propto b_1 + b_2 \exp\left[-\frac{r}{r_0}\right]$



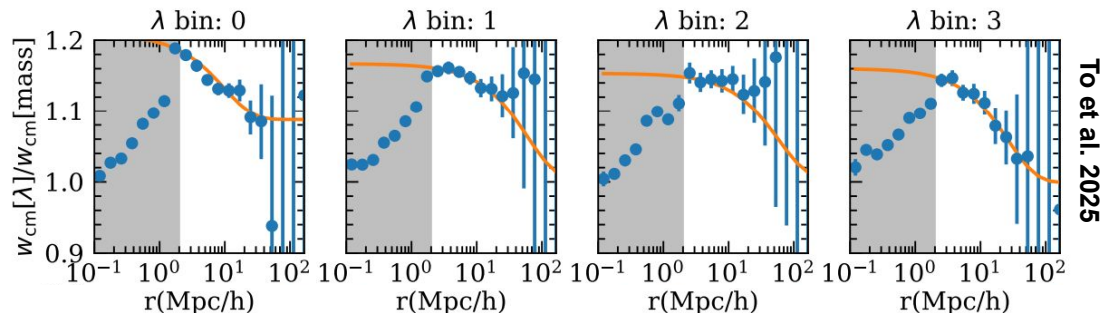
- By-pass several small-scale systematics (e.g. baryonic feedback, cluster miscentering)
- Loss of information (especially related to the lensing one-halo term for the mass calibration)



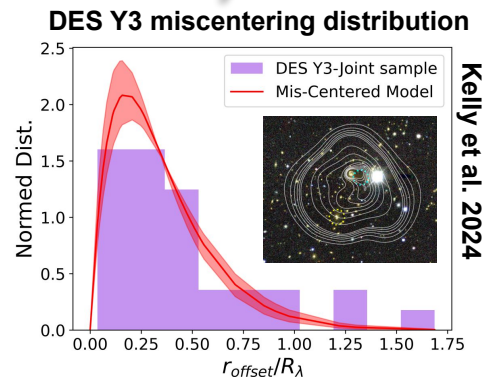
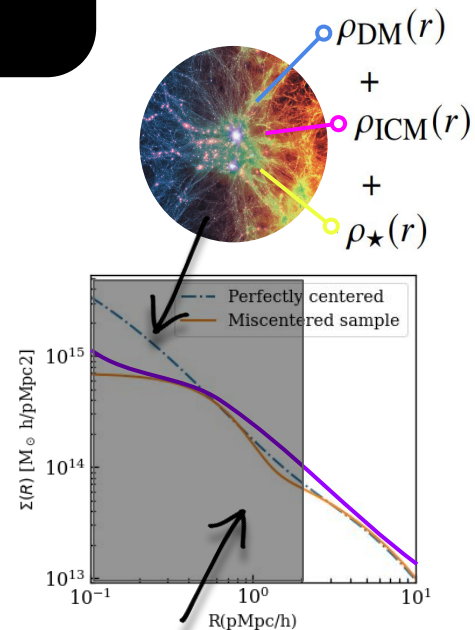
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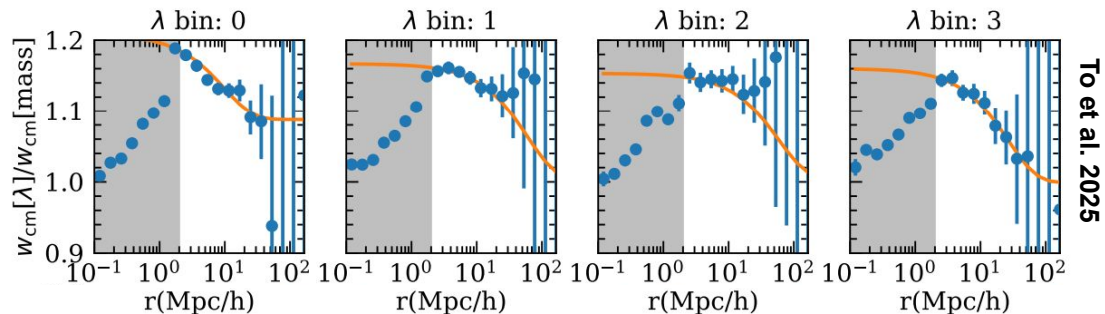
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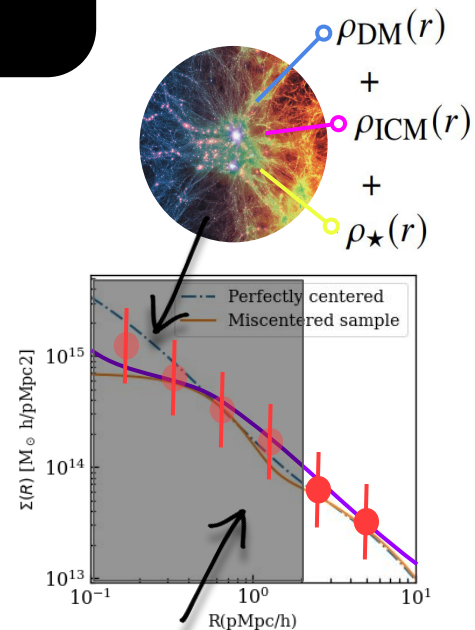
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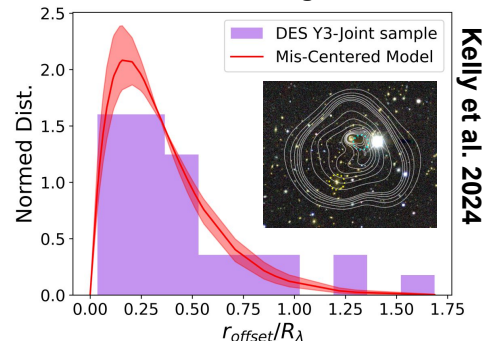
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- **By-pass several small-scale systematics (e.g. baryonic feedback, cluster miscentering)**
- **Loss of information (especially related to the lensing one-halo term for the mass calibration)**



DES Y3 miscentering distribution



Kelly et al. 2024

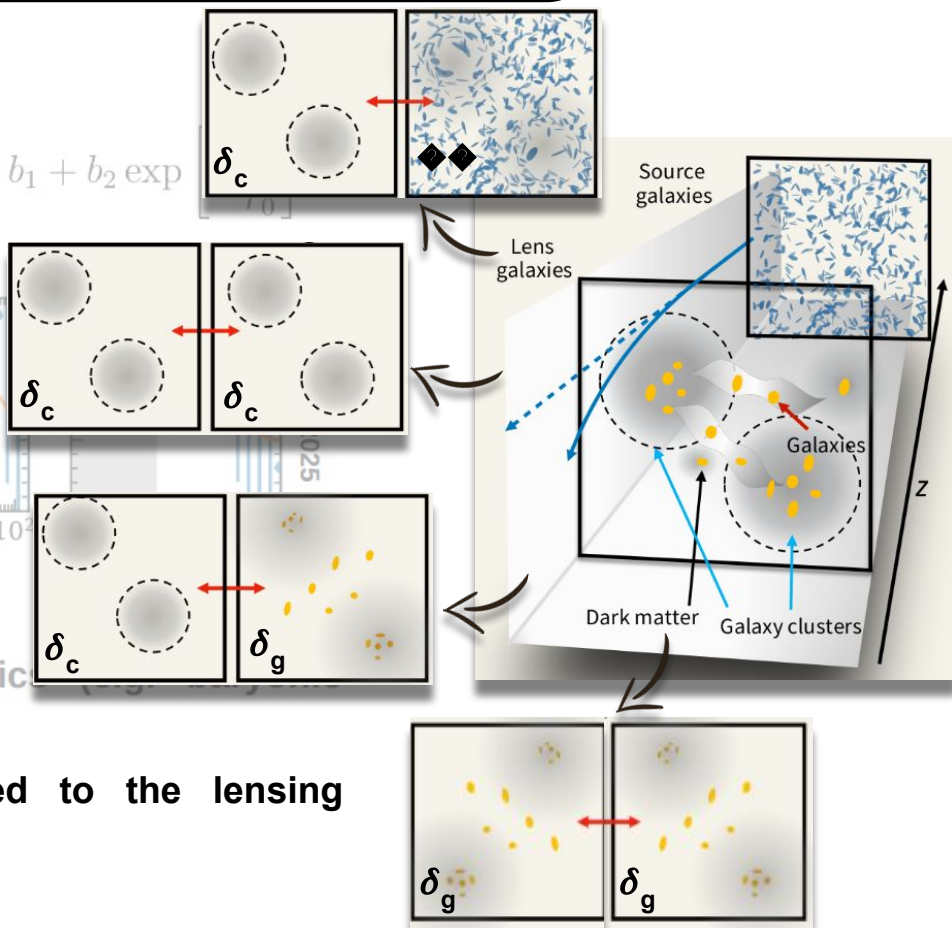
CLUSTER COUNTS x LARGE SCALE TRACERS

By dropping small-scale data we get:

- Simpler model for selection bias: $b_{\text{sel}} = b_1 + b_2 \exp$

Restored by including three auto- and cross-correlation functions: cluster clustering, cluster-galaxies correlation, galaxy clustering

- By-pass several small-scale systematic (feedback, cluster miscentering)
- Loss of information (especially related to the lensing one-halo term for the mass calibration)



Credit Y. Omori

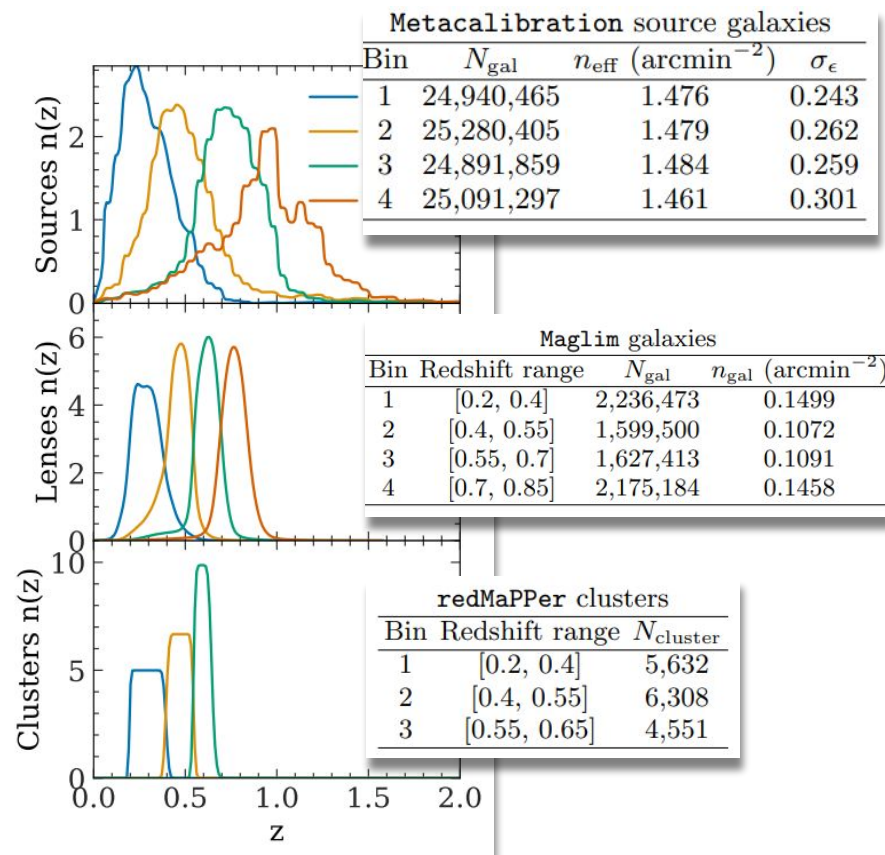
DES Y3 CLUSTER x LARGE SCALE ANALYSIS

Unified analysis framework described by:

- **15 astrophysical parameters** describing the connection between observables and matter fluctuations: linear galaxy bias, optical-cluster bias, intrinsic alignment, richness-mass relation
- **17 parameters to account for observational systematics** (photo-z uncertainties, shear measurements)

From DES Y1 to DES Y3:

- ~3 times larger area (\Rightarrow x 3 clusters)
- Weak lensing noise lower by ~30%
- Cluster lensing data analysis pushed down to 2 Mpc/h



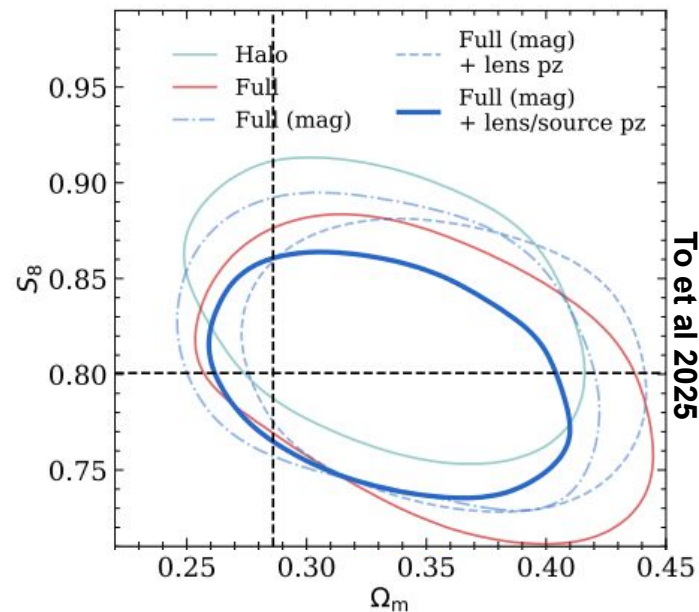
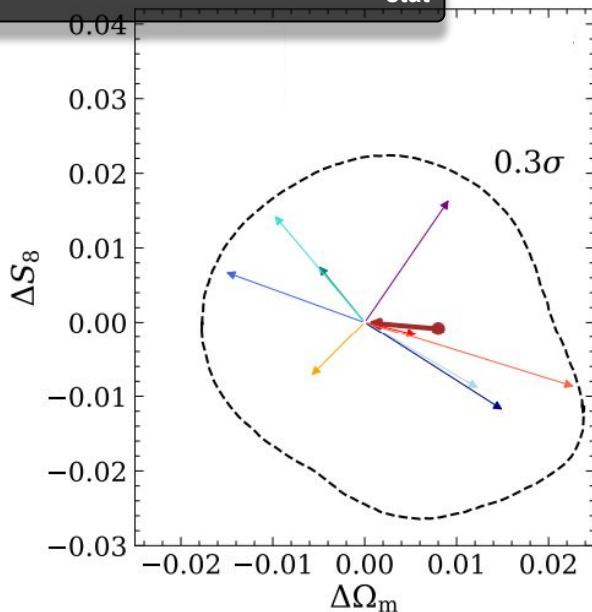
To et al 2025; DES Collaboration 2025

DES Y3 CLUSTER x LARGE SCALE: ROBUSTNESS TESTS

- 9 different systematics were tested individually using a simulated-likelihood approach
- Overall validation performed on simulated data (Cardinal; To+23): 5 different levels of complexity were tested to assess the performance of the cluster finder and model choices

Unblinding requirement: $\Delta\theta < 0.3 \sigma_{\text{stat}}$

- Emu HMF and Bias
- Selection Effect
- MOR
- Hydro matter clustering
- NL Bias
- One-halo lensing
- Hydro HMF and Bias
- NL matter clustering
- NL Bias + NL cluster lens

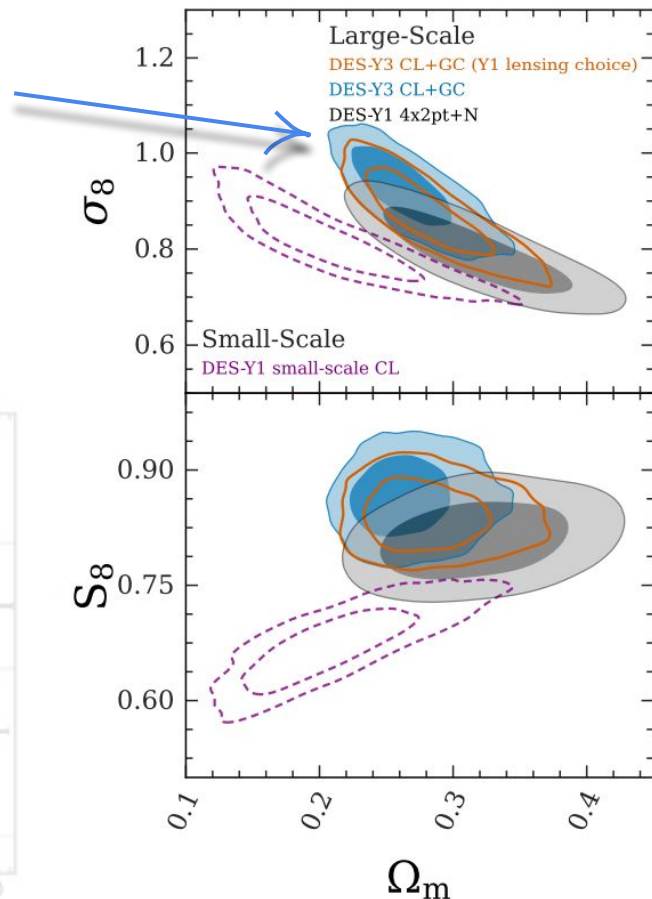
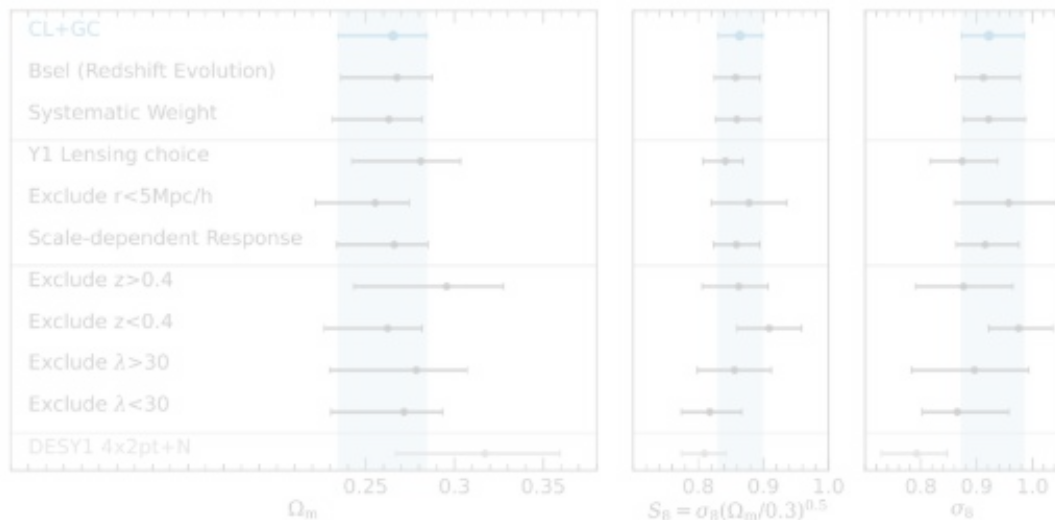


DES Y3 CLUSTER x LARGE SCALE: RESULTS

- DES Y3 cluster cosmological constraints consistent with DES Y1 results, and improved by ~50%.

$$\Omega_m = 0.27^{+0.02}_{-0.03} \quad \sigma_8 = 0.92^{+0.06}_{-0.05} \quad S_8 = 0.86 \pm 0.04$$

- Results are robust against different catalog cuts and model choices

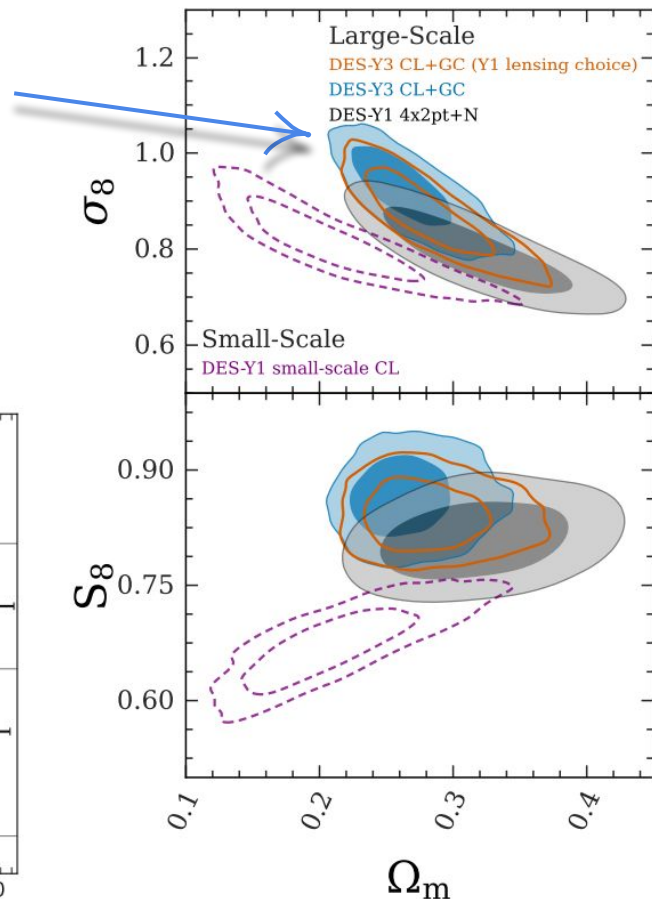
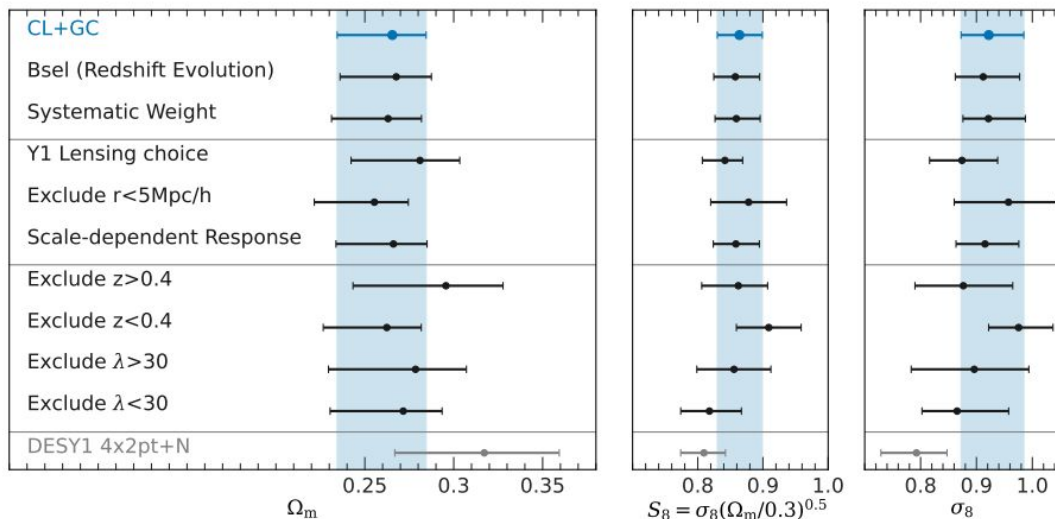


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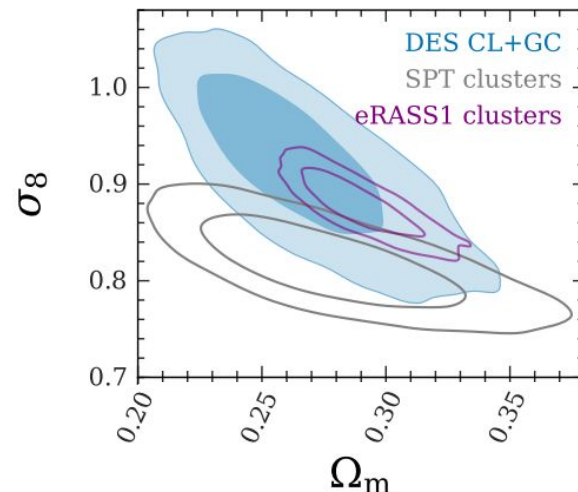
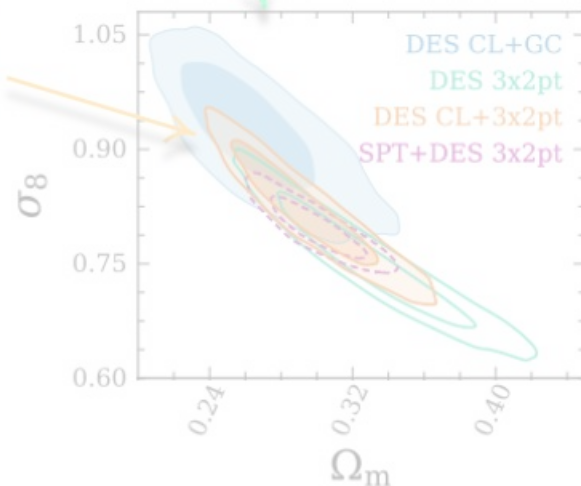
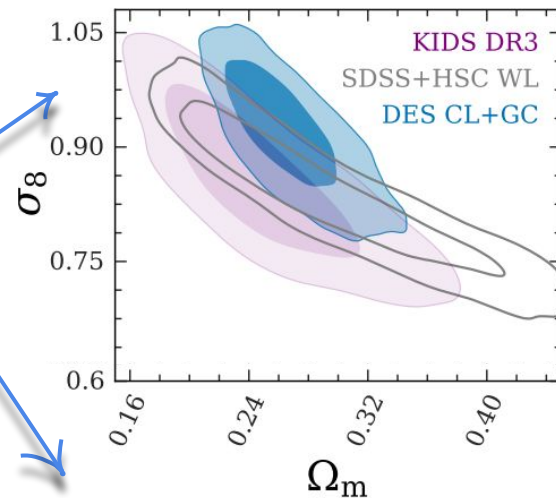
DES Y3 CLUSTER x LARGE SCALE: RESULTS

- Results are also consistent and competitive with other cluster cosmology studies at different wavelengths
- DES Y3 cluster is also consistent with joint analysis of galaxies and weak lensing (3x2pt)
- The combination of all the DES probes entails a further 24% improvement of the cosmological constraints compared to 3x2pt:

$$\Omega_m = 0.29^{+0.02}_{-0.03}$$

$$\sigma_8 = 0.82 \pm 0.05$$

$$S_8 = 0.81 \pm 0.02$$



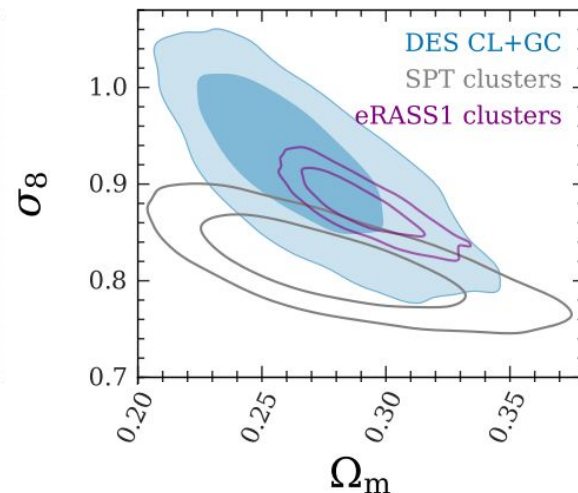
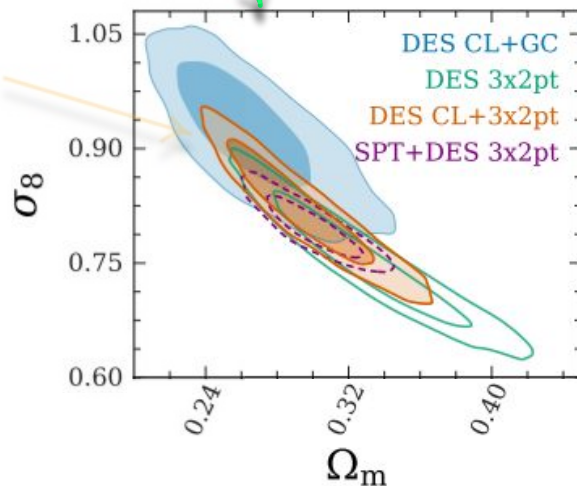
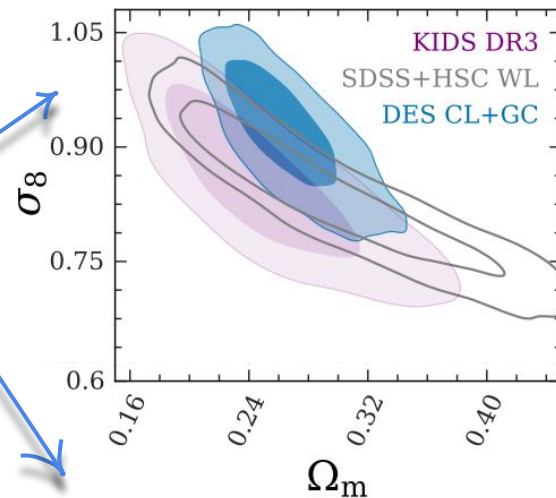
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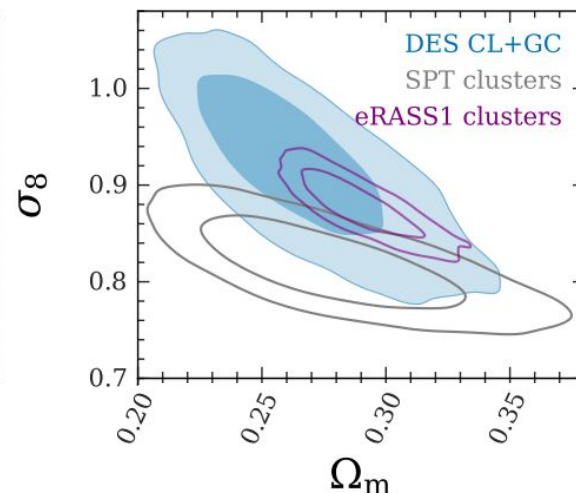
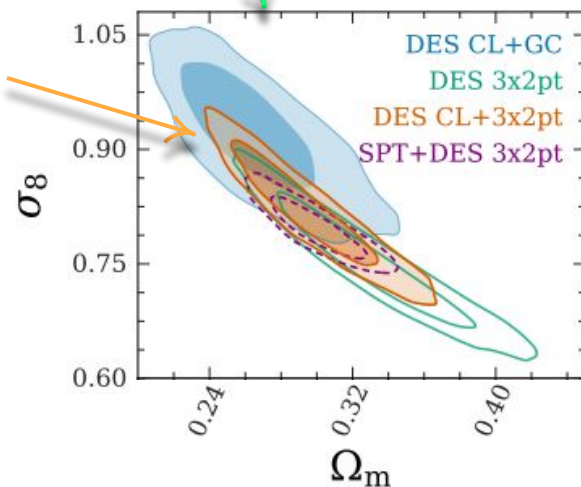
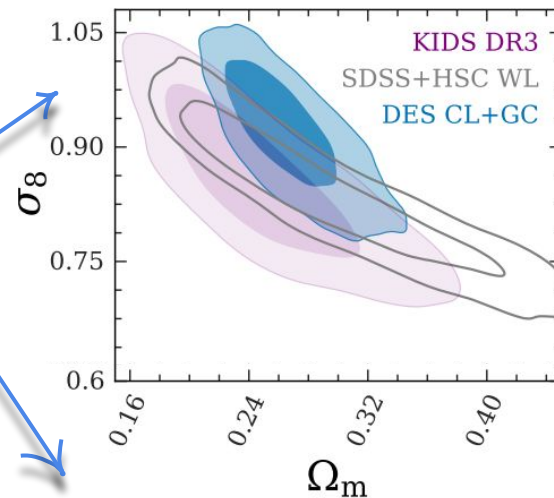
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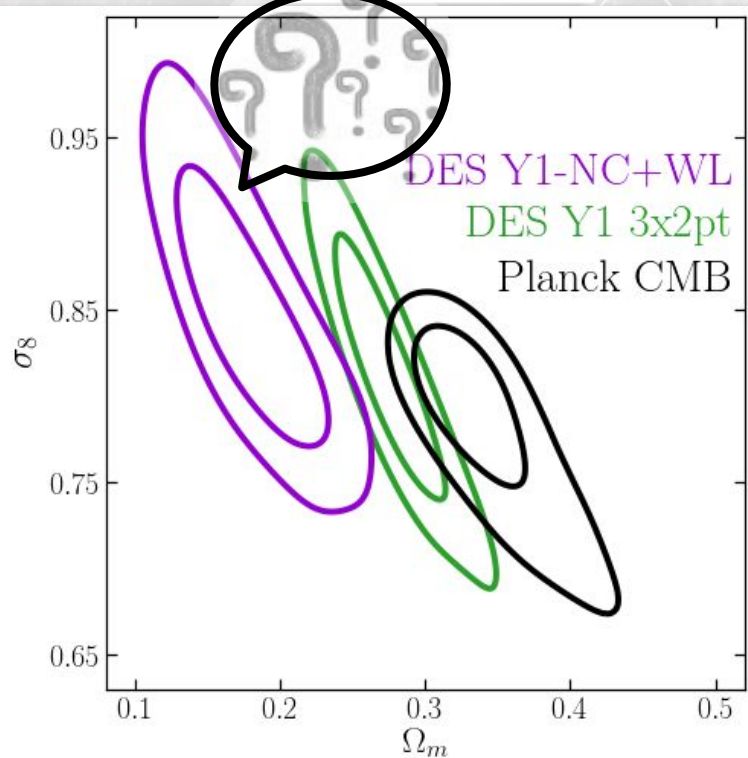


CLUSTER COUNTS x SMALL SCALE LENSING

Line of sight:

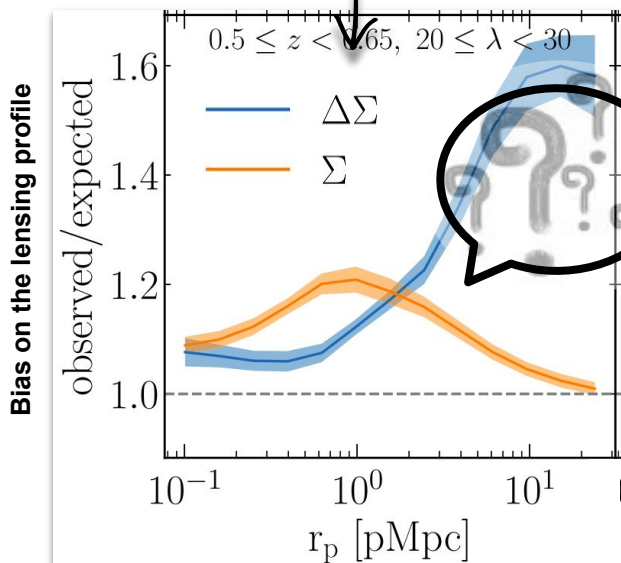
Photo-z resolution @ z=0.4:

0.01 (~100 Mpc)



$$\lambda^{\text{ob}} = \lambda(\mathbf{M}) + \delta\lambda(\lambda, \dots)$$

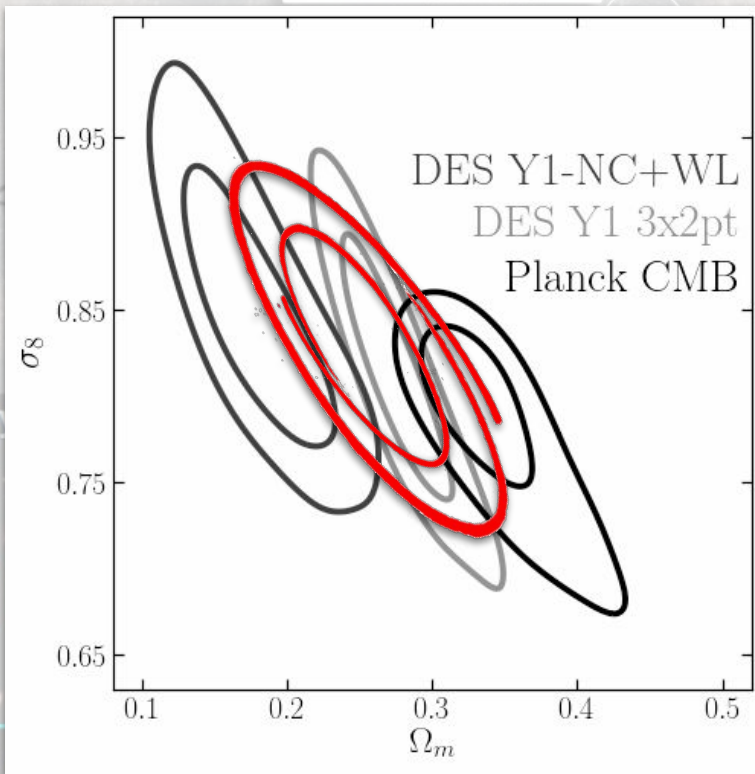
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CLUSTER COUNTS x SMALL SCALE LENSING

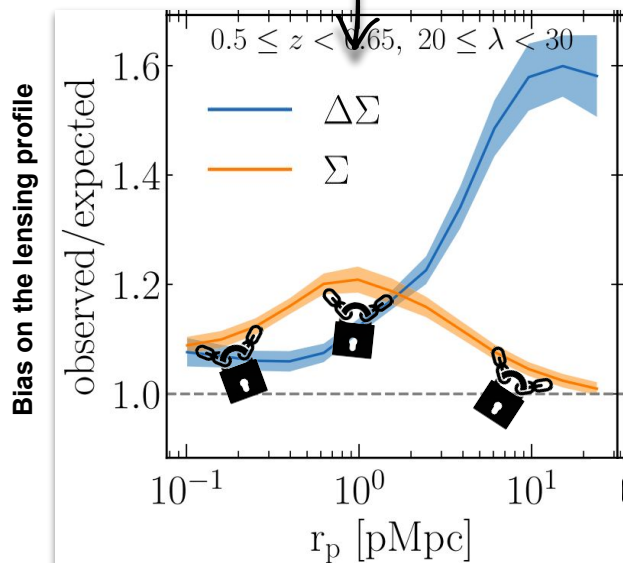
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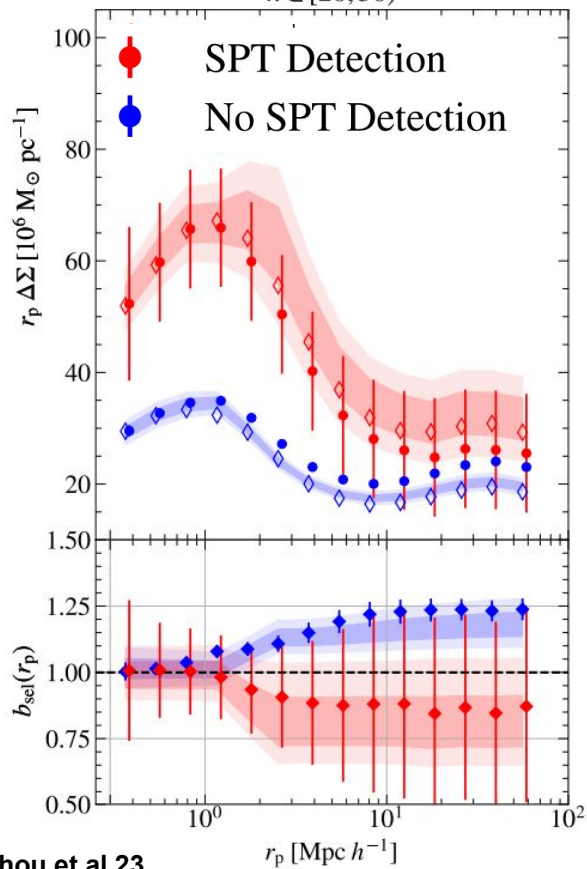
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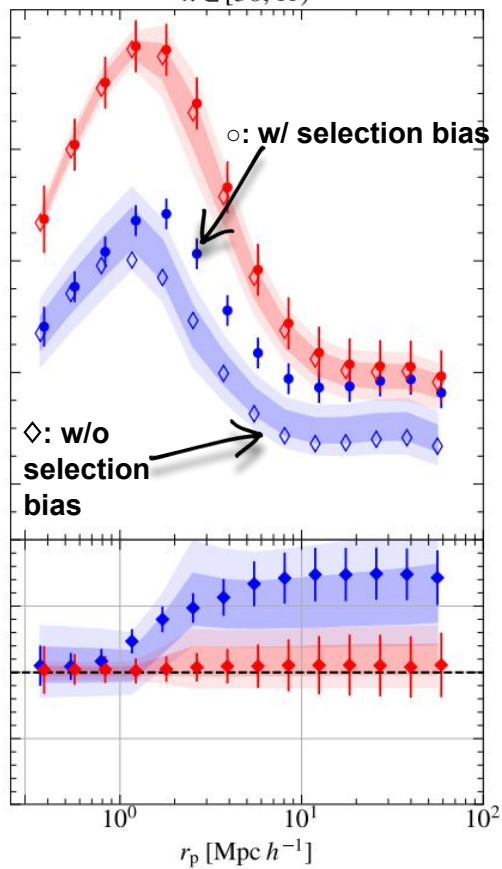
MULTI- λ SELECTION EFFECT BIAS CALIBRATION

Mock lensing profile of DES clusters **matched** and **unmatched** to SPT-SZ

$\lambda \in [20, 50)$



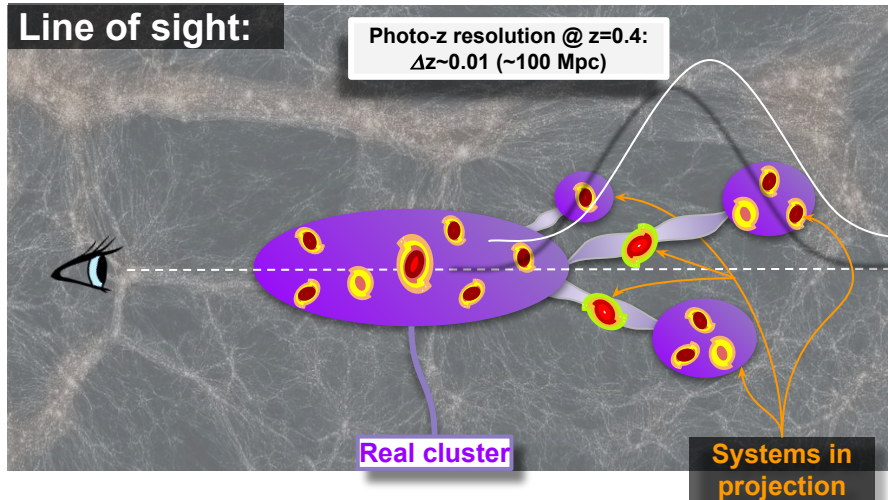
$\lambda \in [50, \infty)$



- Cross match optical and SZ cluster samples and calibrate simultaneously the richness, SZ and WL - mass scaling relations, scatters and correlations
- The SZ signal, being less affected by projection effects, can be effectively used to calibrate the WL selection bias, b_{sel}



MODELING SMALL SCALE SELECTION EFFECT BIAS



$$\lambda^{\text{ob}} = \lambda(M) + \delta\lambda(\lambda, \dots)$$

$$\Sigma^{\text{ob}} = \Sigma(M) + \delta\Sigma(\delta\lambda, \dots)$$

Both $\delta\lambda$ and $\delta\Sigma$ can be expressed as weighted sums of the number of halos in projection, N^{PRJ} :

$$\delta\lambda(\lambda^{\text{ob}}, \lambda^{\text{true}}) \sim \int dz d\lambda d\theta w(\lambda, z) \bar{N}^{\text{prj}}(\lambda, z) [1 + b_h(\lambda) b_{\text{sel}}(\lambda^{\text{true}}, \lambda^{\text{ob}}) w(\theta)]$$

Fraction of λ contributed to the target cluster

Optical cluster bias

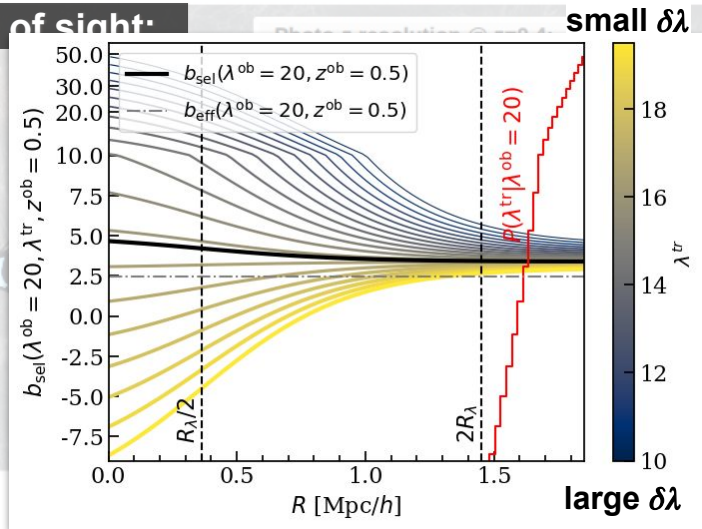
$$\delta\Sigma(\lambda^{\text{ob}}, \lambda^{\text{true}}) \sim \int dz d\lambda d\theta \Sigma(M(\lambda)) \bar{N}^{\text{prj}}(\lambda, z) [1 + b_h(\lambda) b_{\text{sel}}(\lambda^{\text{true}}, \lambda^{\text{ob}}) w(\theta)]$$

Halo density profile

MODELING SMALL SCALE SELECTION EFFECT BIAS

Line of sight:

Optical cluster bias



$$\lambda^{\text{ob}} = \lambda(M) + \delta\lambda(\lambda, \dots)$$

$$\Sigma^{\text{ob}} = \Sigma(M) + \delta\Sigma(\delta\lambda, \dots)$$

Inverting the equation we can derive an expression for b_{sel} as a function of $\delta\lambda$

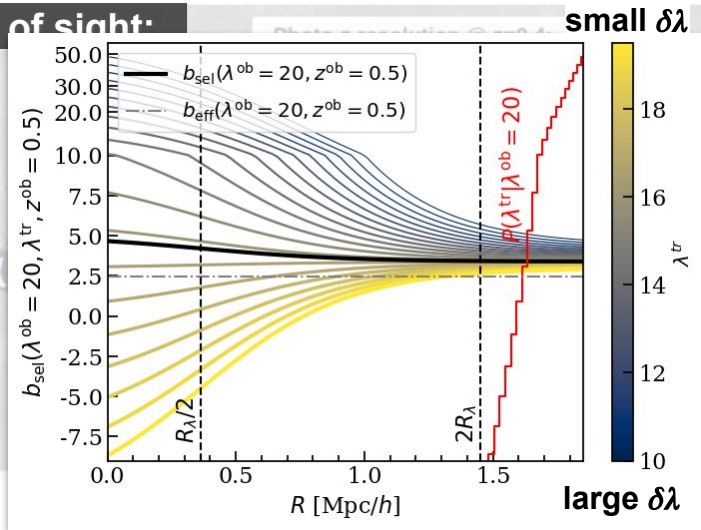
$$\delta\lambda(\lambda^{\text{ob}}, \lambda^{\text{true}}) \sim \int dz d\lambda d\theta w(\lambda, z) \bar{N}^{\text{prj}}(\lambda, z) [1 + b_h(\lambda) b_{\text{sel}}(\lambda^{\text{true}}, \lambda^{\text{ob}}) w(\theta)]$$

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MODELING SMALL SCALE SELECTION EFFECT BIAS

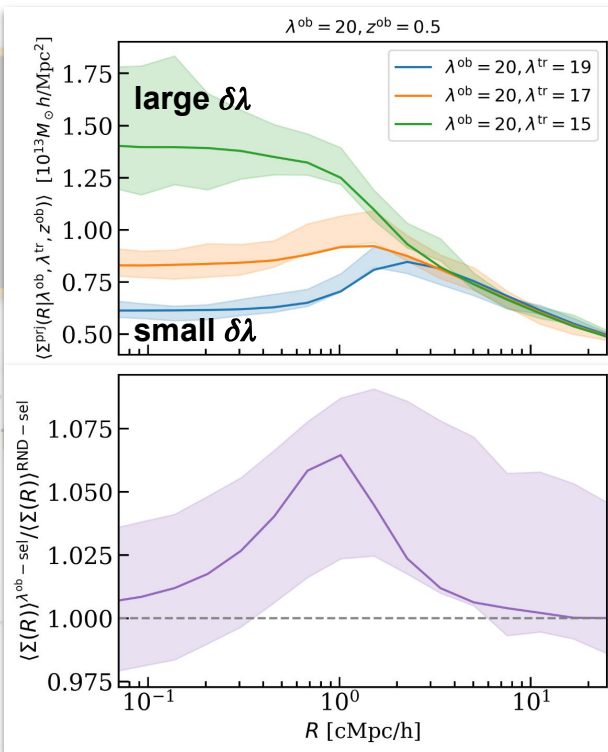
Line of sight:

Optical cluster bias



Density profile from projected structures

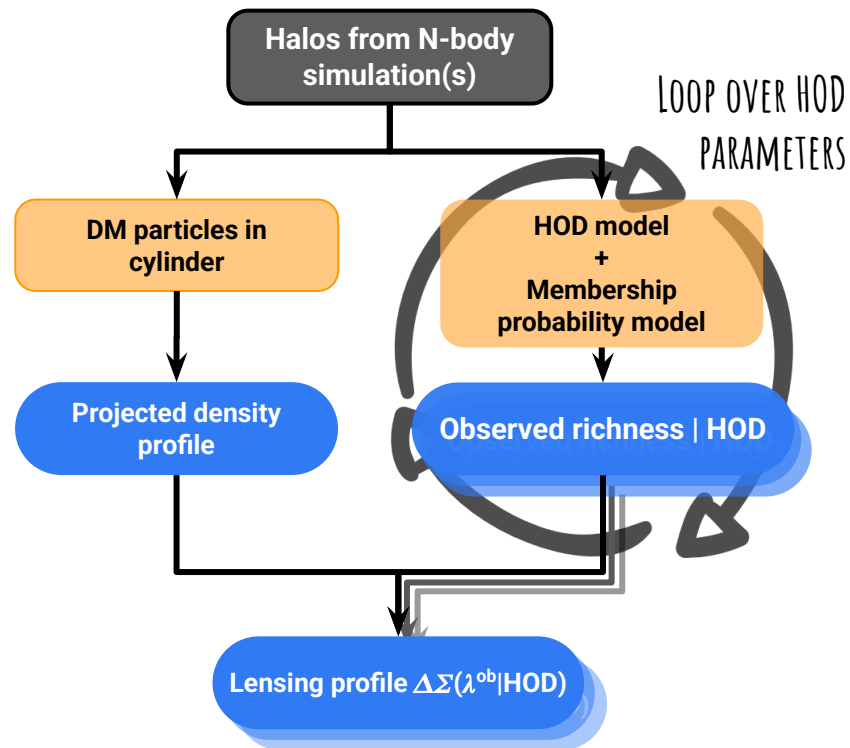
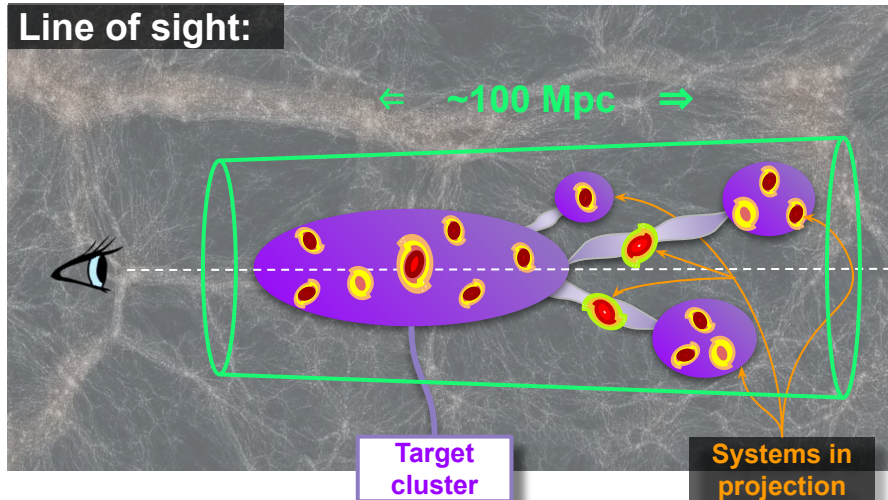
Boost of the lensing profile



$$\delta\lambda(\lambda^{\text{ob}}, \lambda^{\text{true}}) \sim \int dz d\lambda d\theta w(\lambda, z) \bar{N}^{\text{prj}}(\lambda, z)$$

$$\delta\Sigma(\lambda^{\text{ob}}, \lambda^{\text{true}}) \sim \int dz d\lambda d\theta \Sigma(M(\lambda)) \bar{N}^{\text{prj}}(\lambda, z) [1 + b_h(\lambda) b_{\text{sel}}(\lambda^{\text{true}}, \lambda^{\text{ob}}) w(\theta)]$$

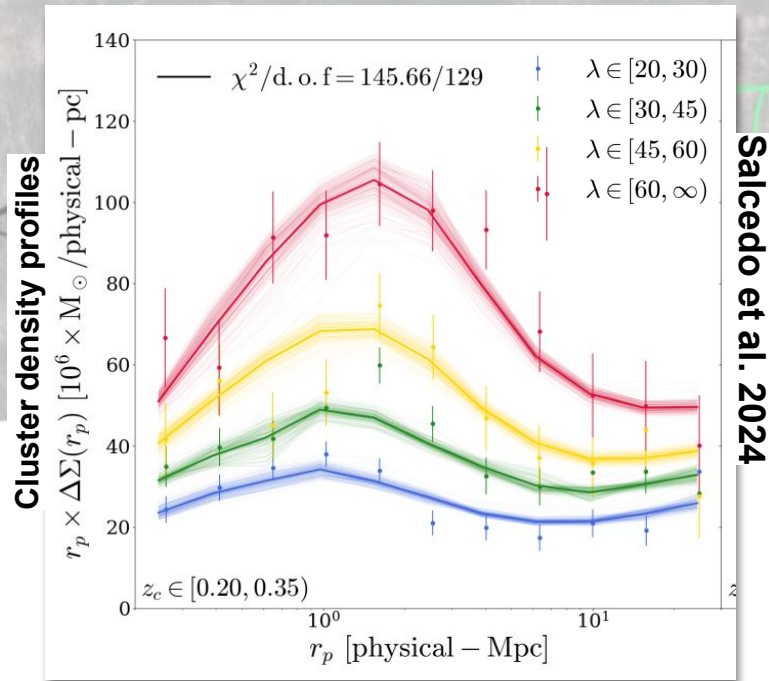
MODELING SMALL SCALE SELECTION EFFECT BIAS



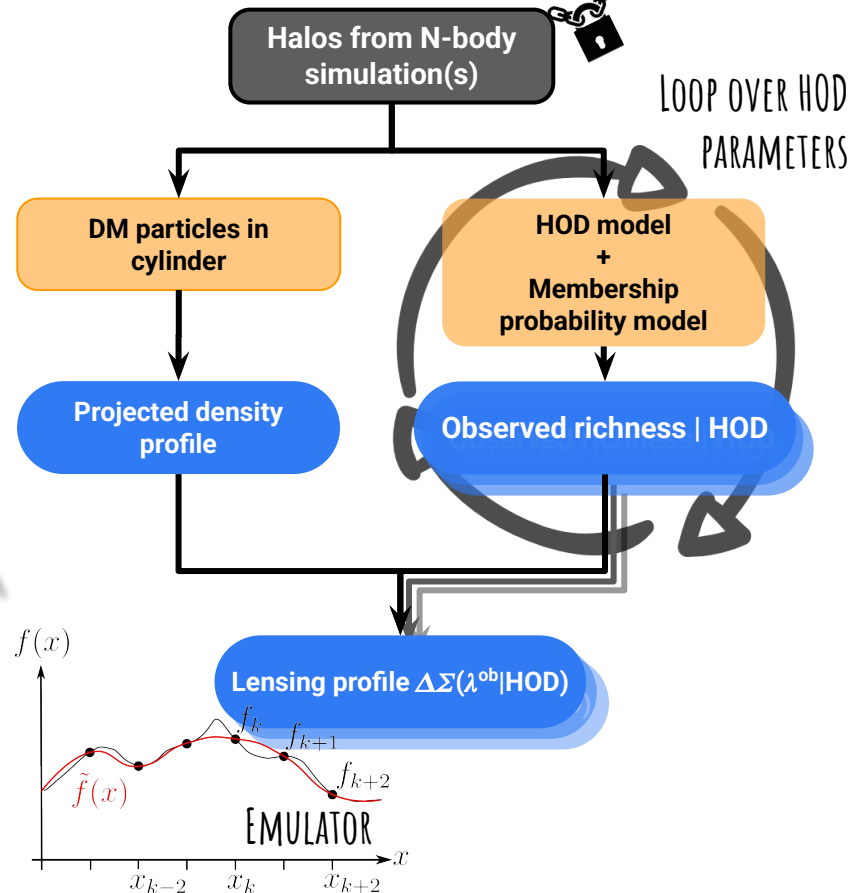
MODELING SMALL SCALE SELECTION EFFECT BIAS

PLANCK 18 COSMOLOGY

Line of sight:

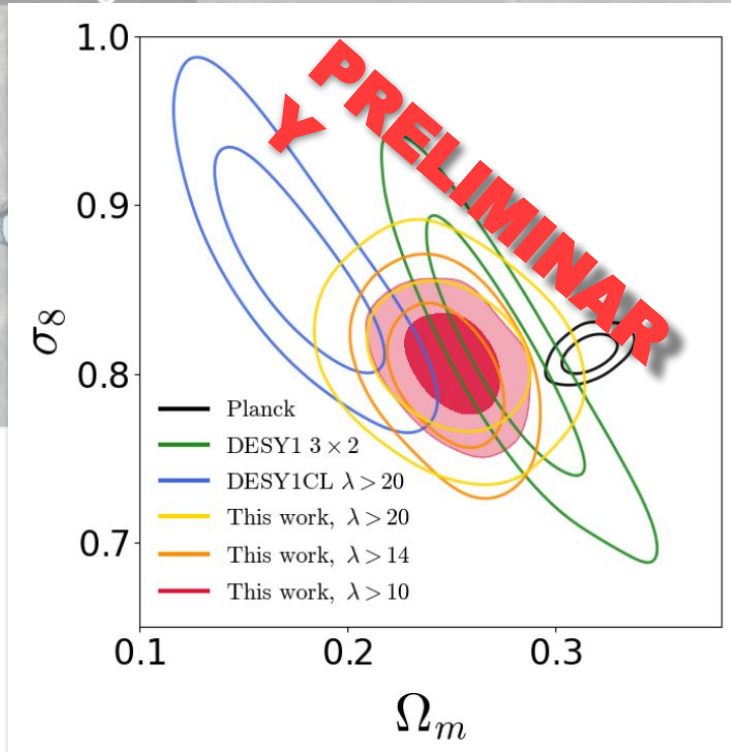


Emulated lensing profiles fitted to DES Y1 cluster lensing profiles



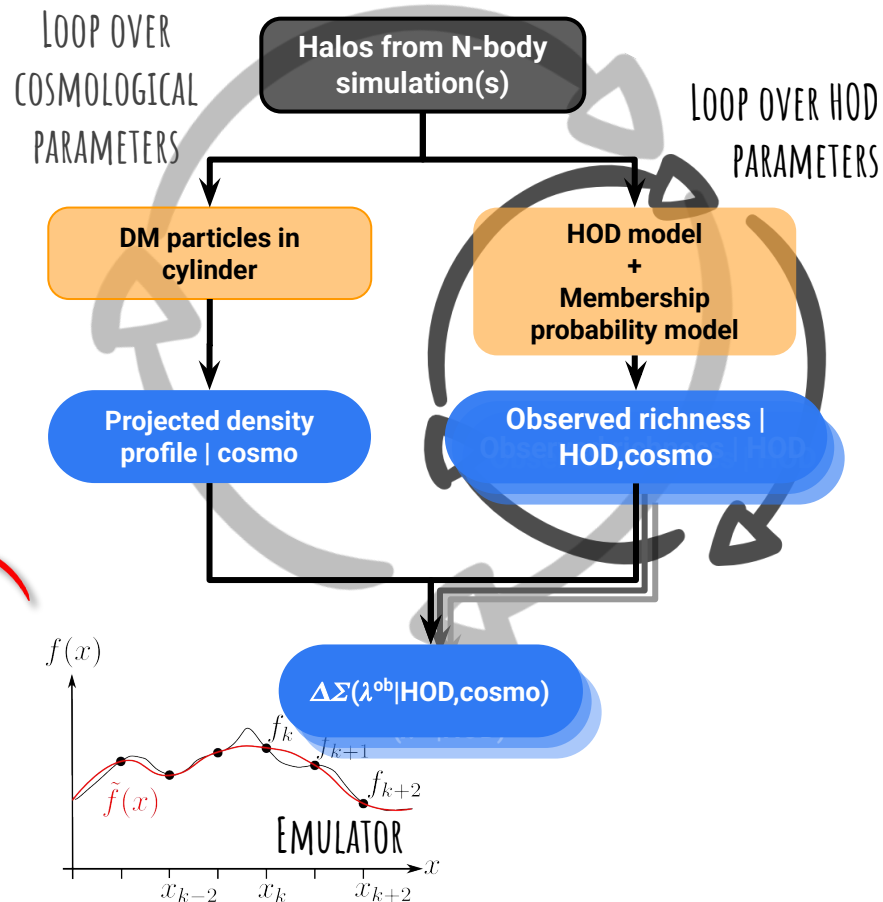
MODELING SMALL SCALE SELECTION EFFECT BIAS

Line of sight:



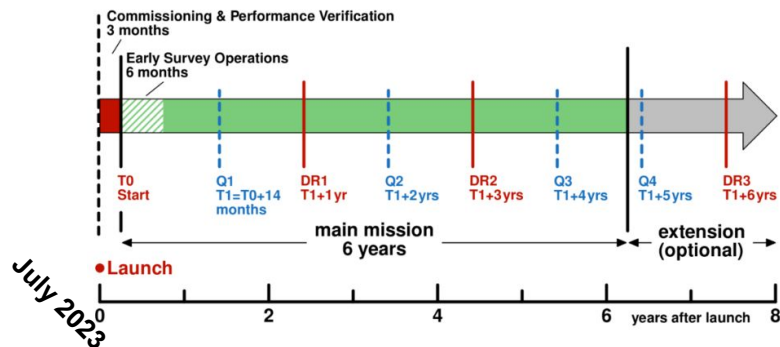
Salcedo et al. in prep.

Simulation Based Inference constraints from DES Y1 cluster lensing



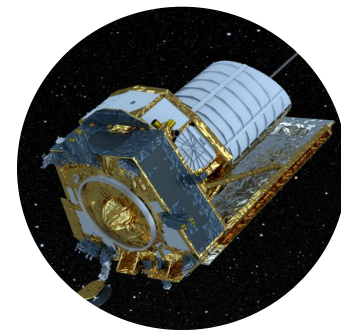
THE EUCLID MISSION

- **Wide Survey: 15.000 deg² Deep Survey: 40 deg²**
- **Main mission: 6 years**
- **Instruments:**



Instrument	VIS	NISP			
Field-of-View	0.787×0.709 deg ²	0.763×0.722 deg ²			
Capability	Visual Imaging	NIR Imaging Photometry		NIR Spectroscopy	
Wavelength range	550– 900 nm	Y (920-1146nm),	J (1146-1372 nm)	H (1372-2000nm)	1100-2000 nm
Sensitivity	24.5 mag 10σ extended source	24 mag 5σ point source	24 mag 5σ point source	24 mag 5σ point source	3 10 ⁻¹⁶ erg cm ⁻² s ⁻¹ 3.5σ unresolved line flux

- **Cosmological probes:**
 - **Galaxy clustering (projected and 3D), cosmic shear, Galaxy Clusters**



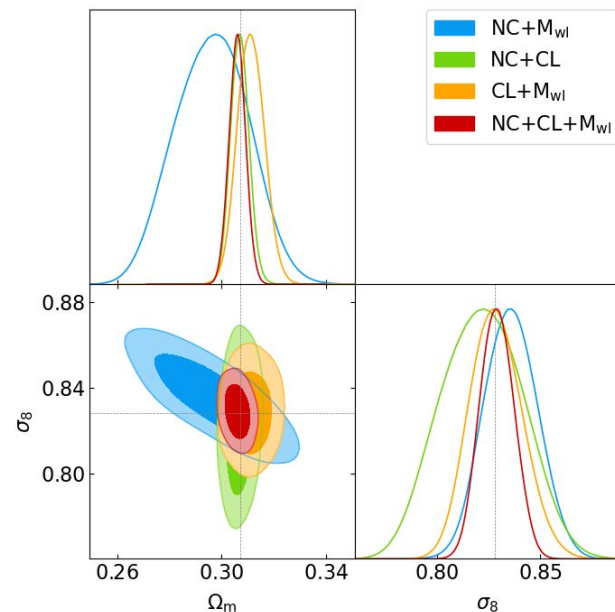
EUCLID CLUSTER COSMOLOGY

Euclid DR1 Cluster Catalog:

- $\sim 1900 \text{ deg}^2$ up to $z \sim 1.5$
- Based on two cluster finders (Euclid preparation: Adam+19):
 - AMICO , PZwav
- Mass proxy: Richness (Castignani&Benoist 2016)

Euclid Cluster Cosmology Probes:

- Cluster counts
- Stacked Cluster Weak Lensing profile
- Clustering of clusters



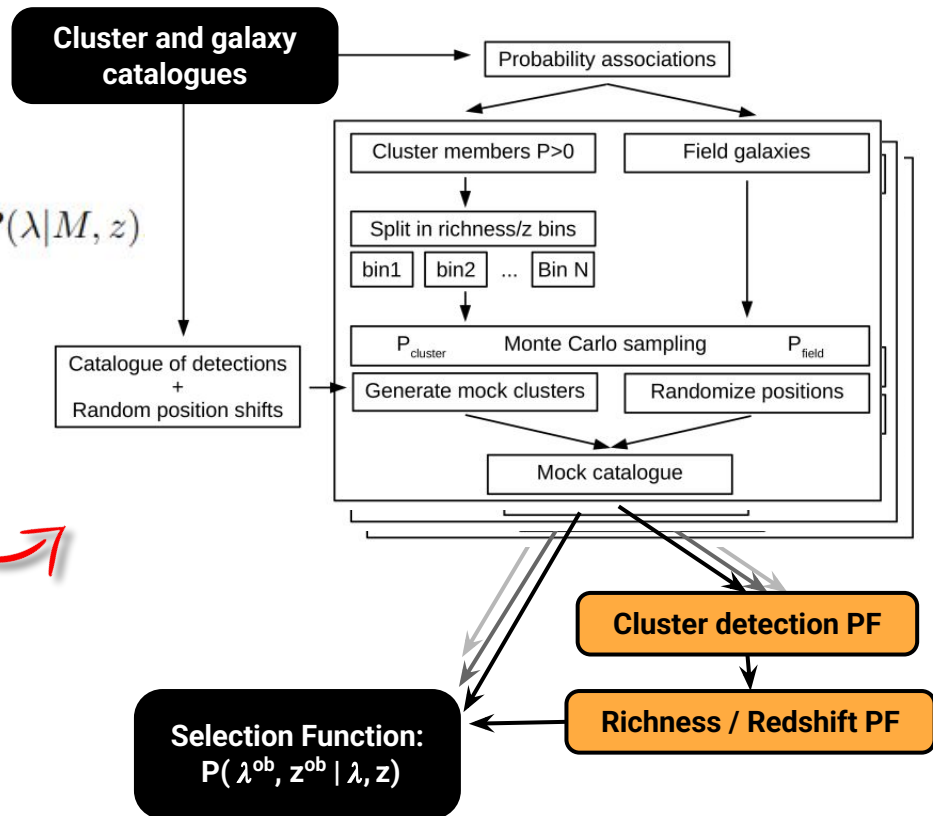
Fumagalli et al in prep.

EUCLID CLUSTER SELECTION FUNCTION

- Observed richness-mass relation:

$$P(\lambda^{\text{ob}}|M, z) = \frac{1}{\mathcal{P}(\lambda^{\text{ob}}, z)} \int_0^\infty d\lambda \mathcal{C}(\lambda, z) P(\lambda^{\text{ob}}|\lambda, z) P(\lambda|M, z)$$

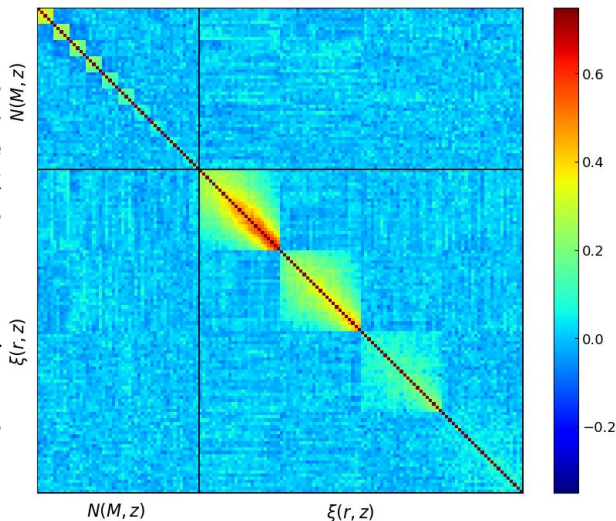
Purity, Completeness and Selection Function empirically calibrated using a simulation based approach applied to the data



EUCLID CLUSTERING OF CLUSTERS CALIBRATION

Top: Cluster counts and clustering auto- and cross-covariance from 1000 mock simulations

Bottom: Comparison of numerical and analytic cluster counts and clustering covariance terms

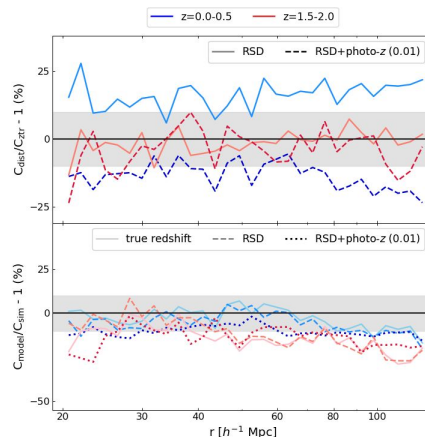
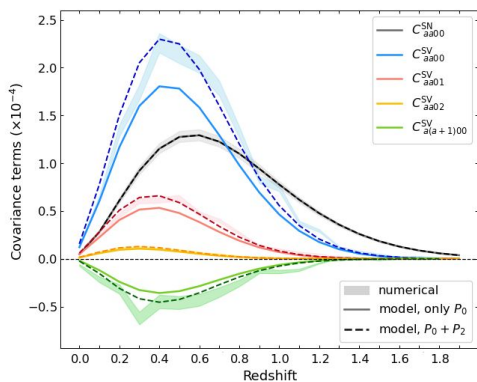


APPROXIMATE MOCKS:
 1000 PINOCCHIO (Monaco+13) halo light-cone catalogs at fixed cosmology painted with Euclid-like cluster observables (Fumagalli+22,+in prep)

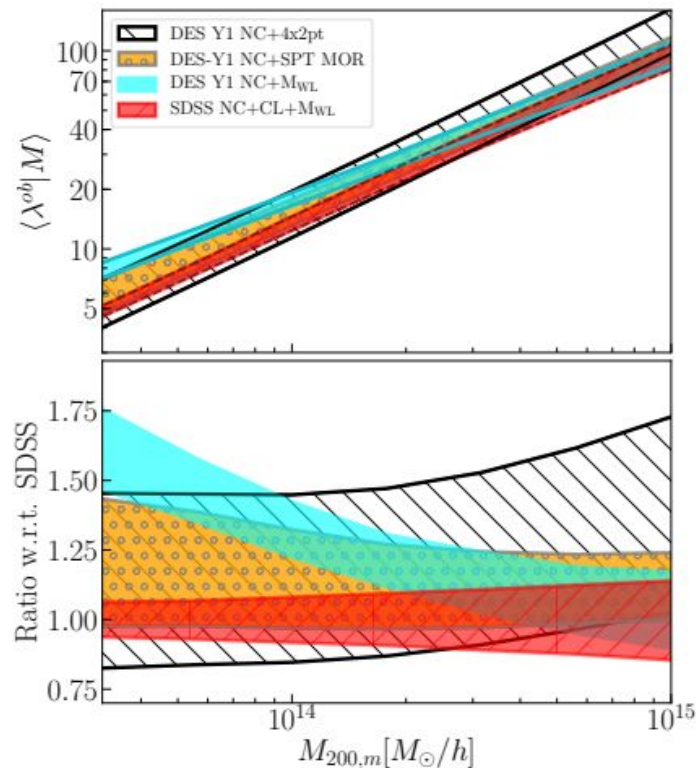
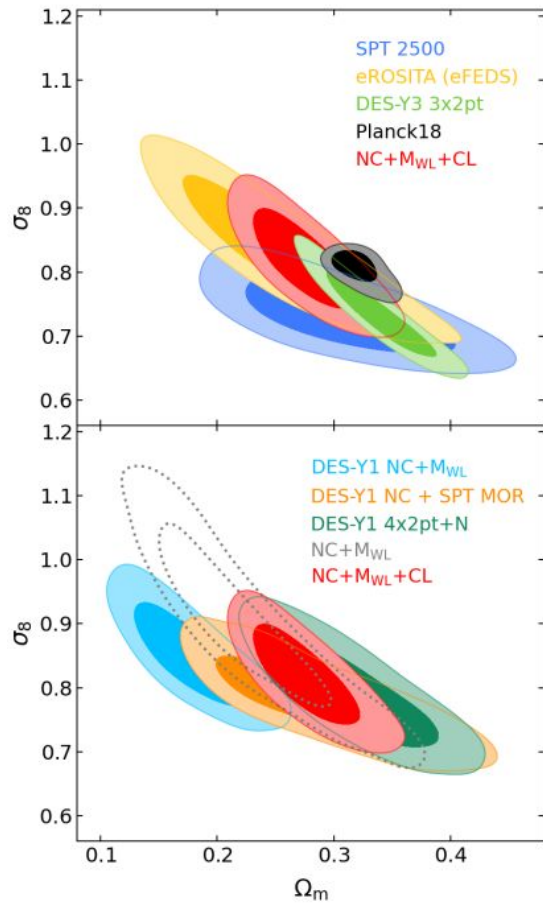
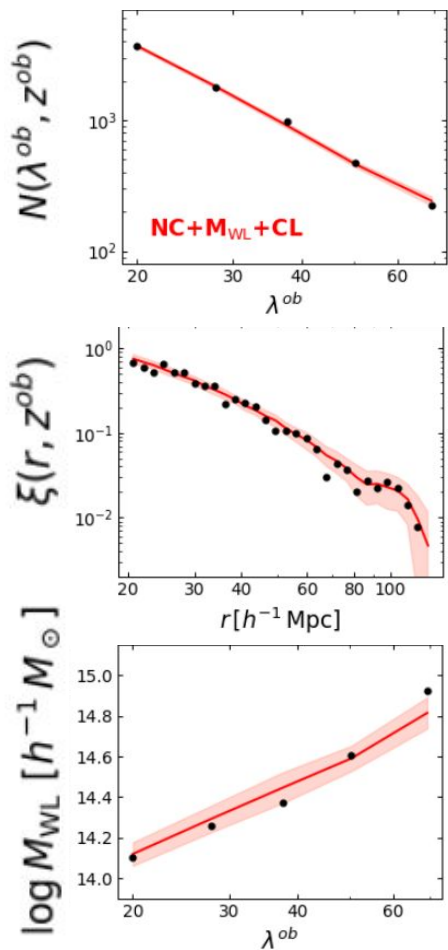


- **Covariance matrix:** Cluster counts and 2pt correlation function analytical covariance matrix calibrated and vetted against PINOCCHIO mock catalogs. Modeling includes: photo-z uncertainty, richness estimate error and RSD

Fumagalli et al in prep.



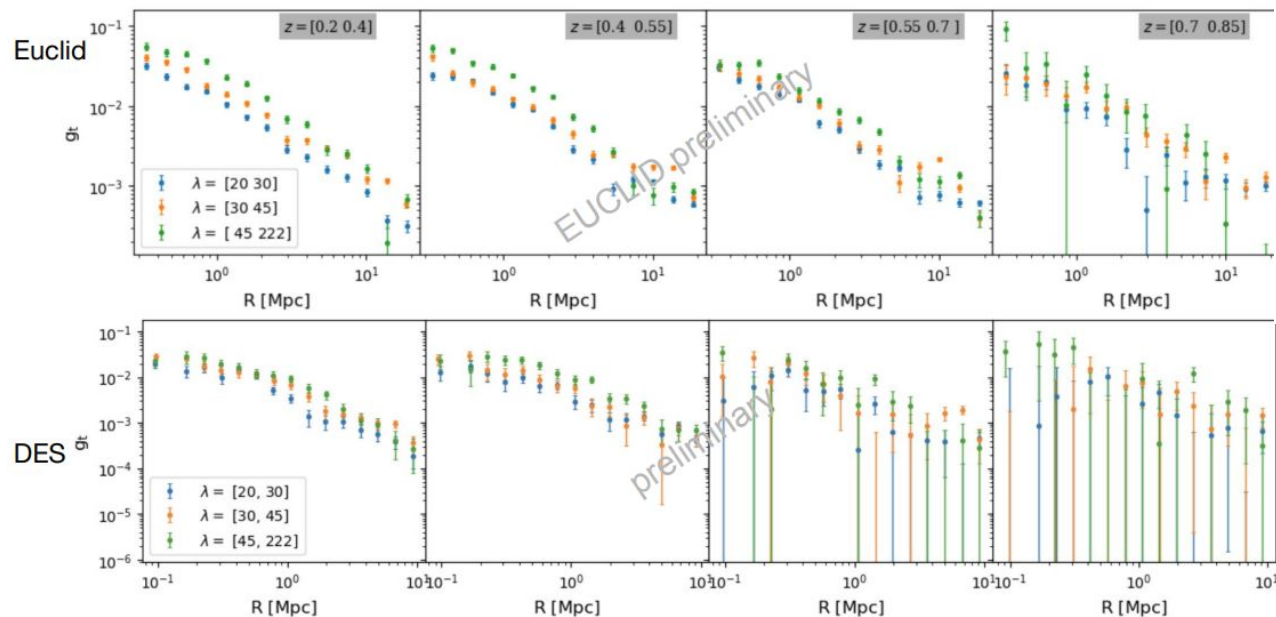
CLUSTERING OF CLUSTERS: TEST ON redMAPPER SDSS



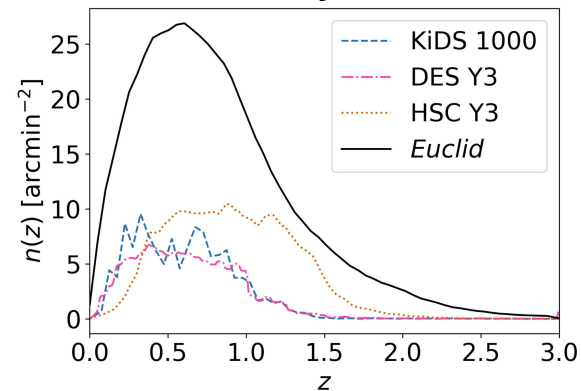
Fumagalli et al 2024

EUCLID CLUSTER LENSING

Comparison of stacked lensing profile of RR2 Euclid clusters using Euclid lensing data or DES lensing data.



Source density vs redshift



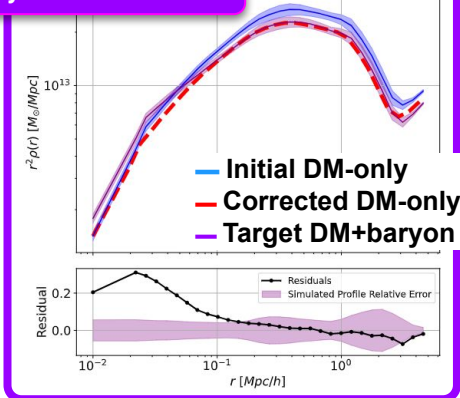
Higher number density of galaxies and many more sources at higher redshifts compared with Stage III surveys!

Credit: Lucie Baumont

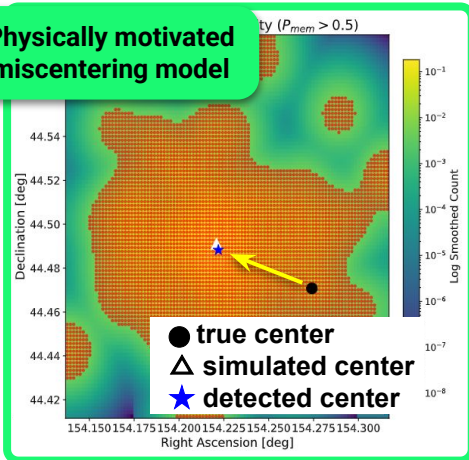
EUCLID CLUSTER LENSING CALIBRATION

Ingrao et al in prep.

Baryonification model



Physically motivated miscentering model



Halos from N-body simulation(s)

DM particles in cylinder

Projected density profile

HOD model + Membership probability model

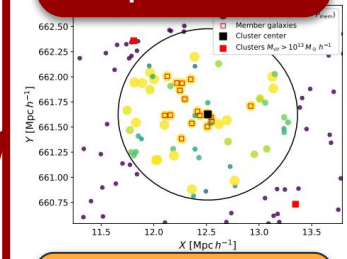
Observed richness | HOD

$\Delta\Sigma(\lambda^{\text{obs}}|\text{HOD}, \text{cosmo})$

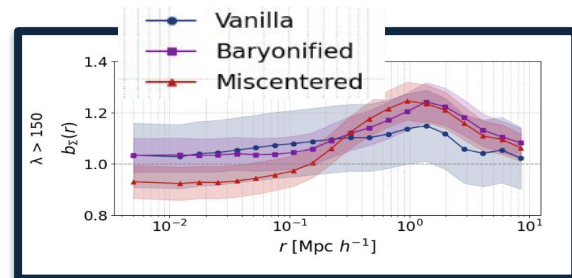
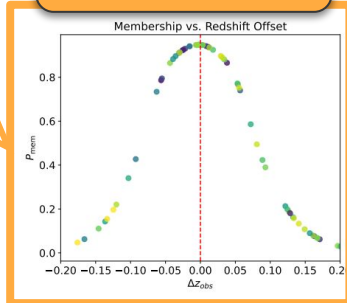
Lensing observational systematics

$g_t(\lambda^{\text{obs}}|\text{HOD}, \text{cosmo}, \text{sys})$

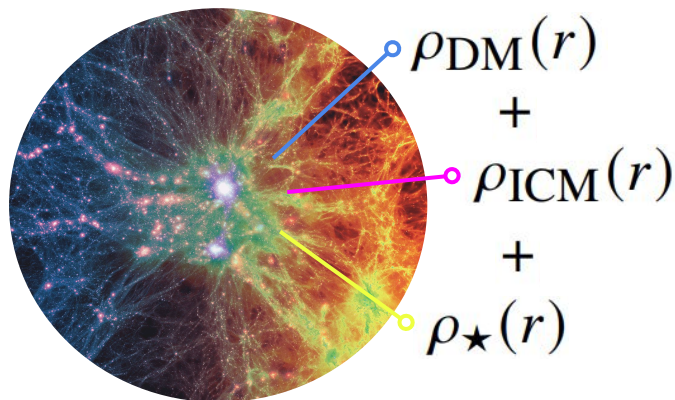
Galaxies painted according to particle positions



P_{mem} model based on Neural Network

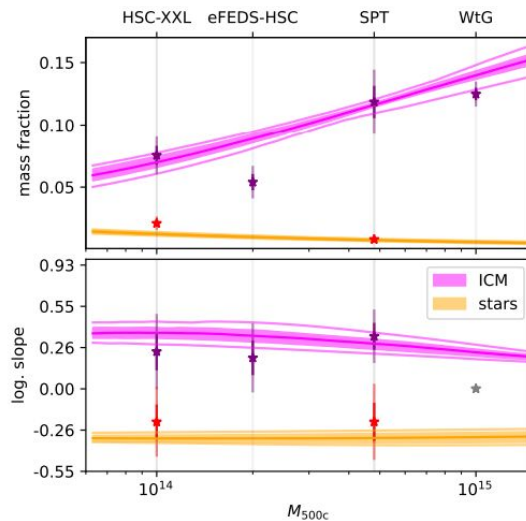


BARYONIC FEEDBACK CALIBRATION WITH GC MULTI- λ

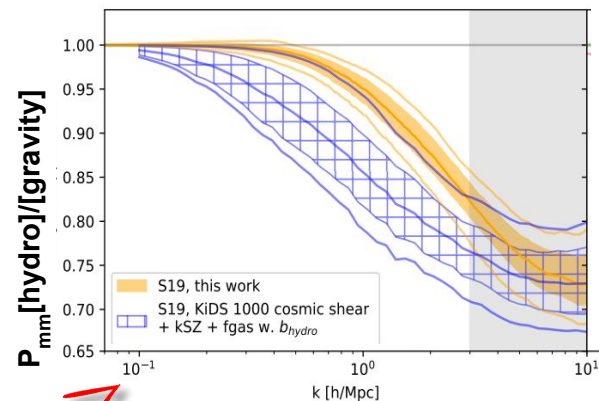


- Multi- λ data provide a means to probe the gas (X-ray, SZ) and stellar (optical/IR) components of clusters
- Combining gas and stellar mass measurements with halo mass estimates (e.g. from WL) it is possible to constrain the modulation of the matter clustering due to baryonic feedbacks

Stellar/ICM mass fraction measurements vs prediction from X-ray and SZ surveys



Matter power spectrum suppression due to baryonic feedbacks

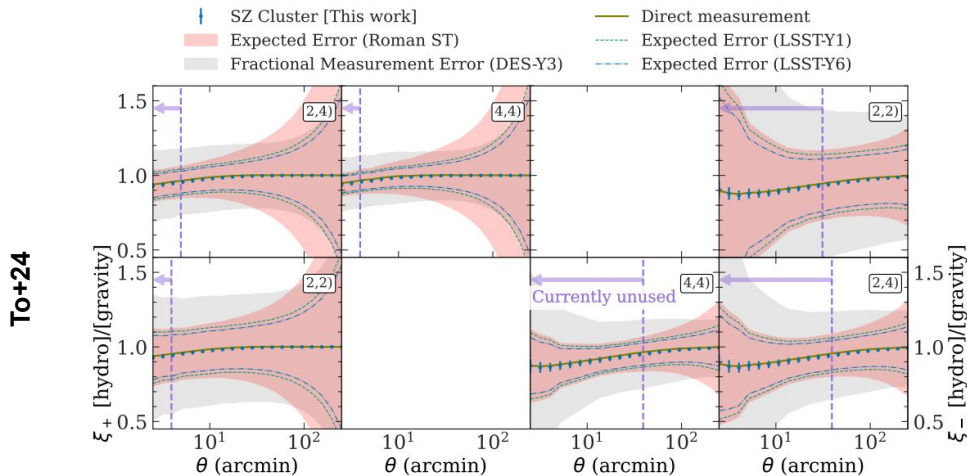


Grandis+24

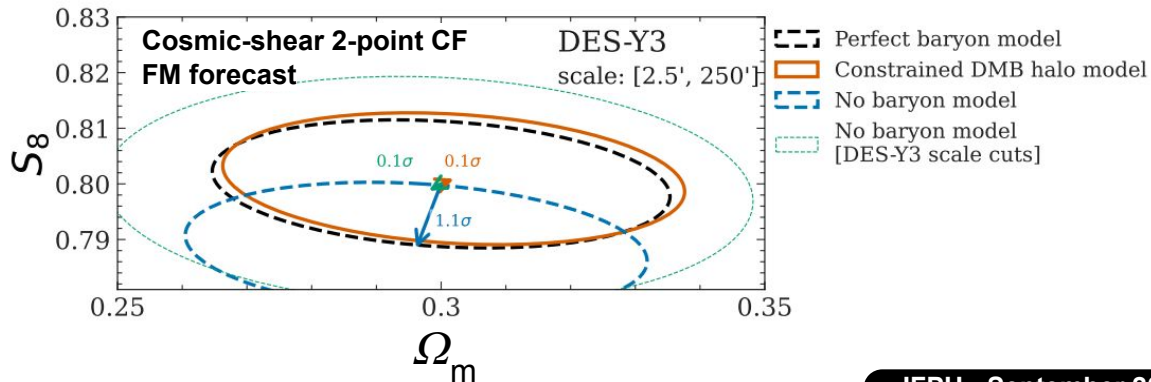
Also see Pandey+21, Troster+22, Schneider+22, To+24, Dalal 25

MULTI-PROBE COSMOLOGY WITH GCs

Cosmic-shear 2-point CF mock measurements




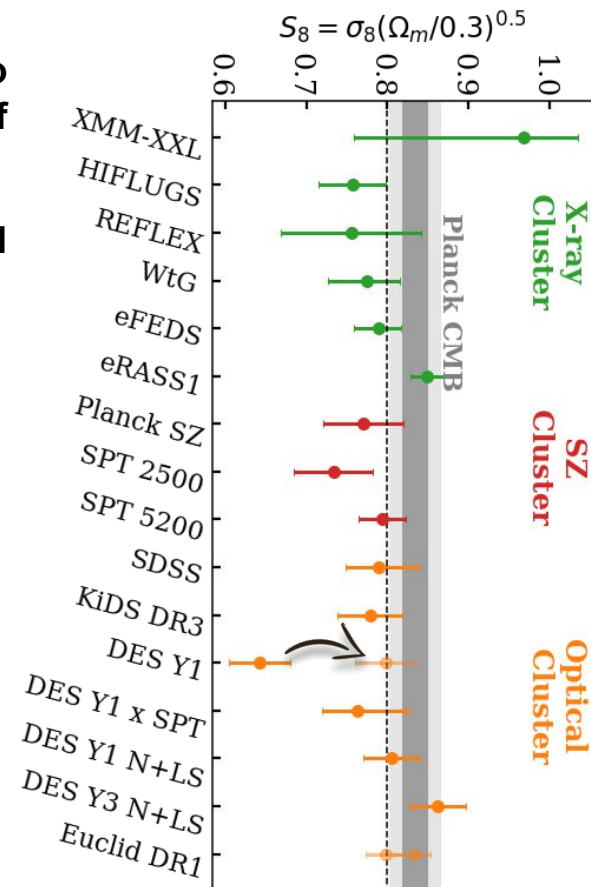
- Calibration of baryonic feedback on the matter power spectrum allows to push to smaller scale the cosmological analysis of other LSS probes



SUMMARY & TAKEAWAYS

- Photometric surveys provide a unique, self-sufficient data set to carry out cluster cosmology studies leveraging a unique range of masses
- In DES we pursue two complementary approaches to mitigate optical selection biases:
 - Number Counts + Clustering of Large Scale Tracers
 - Number Counts + Small Scale cluster lensing profile


SBI is emerging as a promising framework to handle complex systematics and push the analysis to lower richness



SUMMARY & TAKEAWAYS

- Latest DES – and other optical cluster surveys – provide cosmological constraints consistent and competitive with cluster surveys at other wavelengths, as well as with other LSS probes.
 - Galaxy clusters should be regarded as a key ingredient of multi-probe analyses: combined with other probes of the LSS, cluster data is capable of constraining astrophysical parameters and breaking cosmological degeneracies improving the overall constraining power.
- The Euclid mission is poised to significantly expand cluster cosmology capabilities, thanks to its high-quality lensing data, and by extending observations to higher redshifts (up to $z \sim 1.5-2.0$) and larger area ($\sim 15000 \text{ deg}^2$)

Stay tuned for the upcoming DES Y6 (~end 25) and Euclid DR1 (~end 26) optical cluster analyses!

