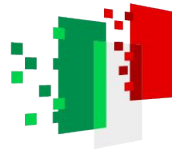




**Finanziato  
dall'Unione europea**  
NextGenerationEU



**Italiadomani**  
PIANO NAZIONALE  
DI RIPRESA E RESILIENZA



**DARK ENERGY  
SURVEY**

# CLUSTER COSMOLOGY: A MULTIWAVELENGTH VIEW



**UNIVERSITÀ  
DEGLI STUDI  
DI TRIESTE**



September 2024 | 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:

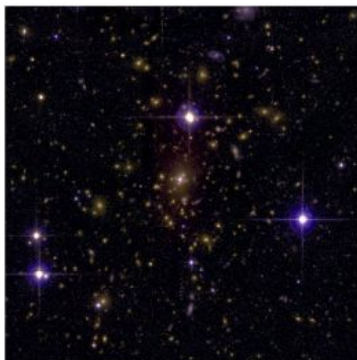
Galaxies and stars (~5%)

ICM (~15%)

DM (~80%)



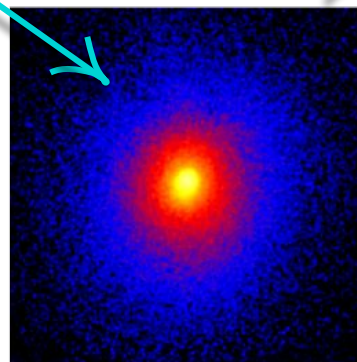
OPTICAL



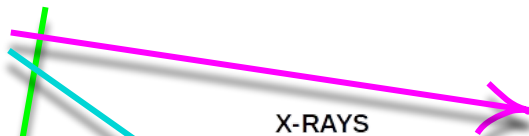
RICHNESS, LENSING EFFECTS



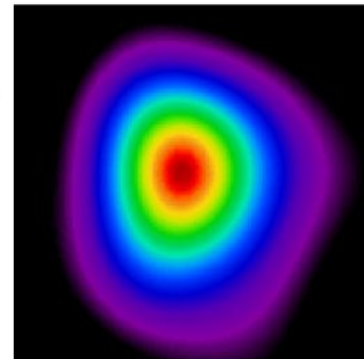
X-RAYS



LUMINOUS AND EXTENDED X-RAY SOURCES



MICROWAVES

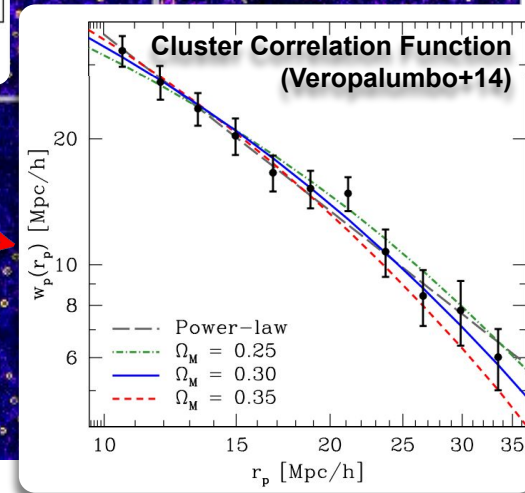
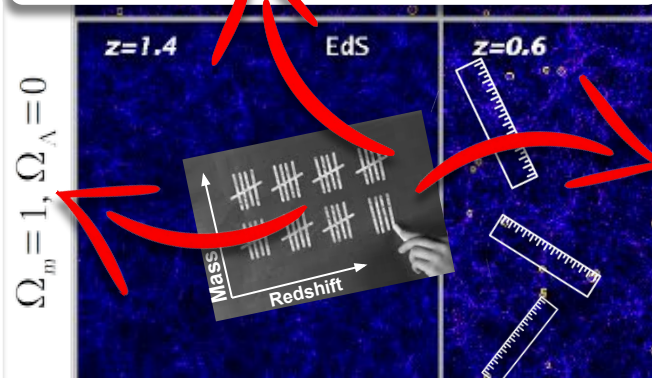
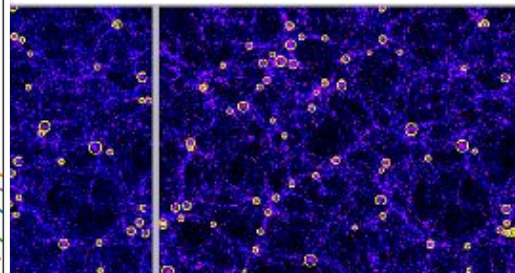
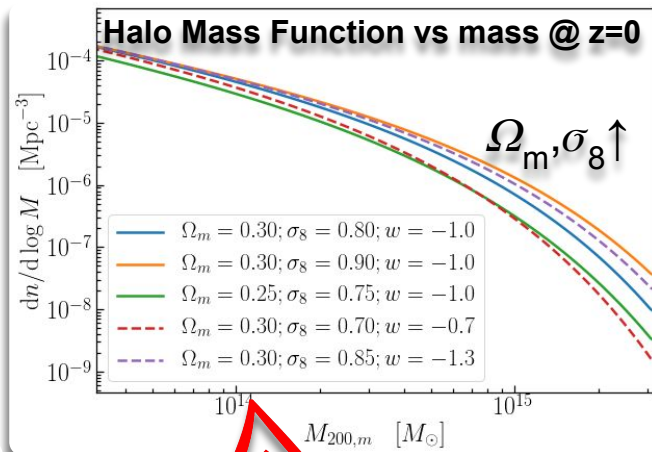
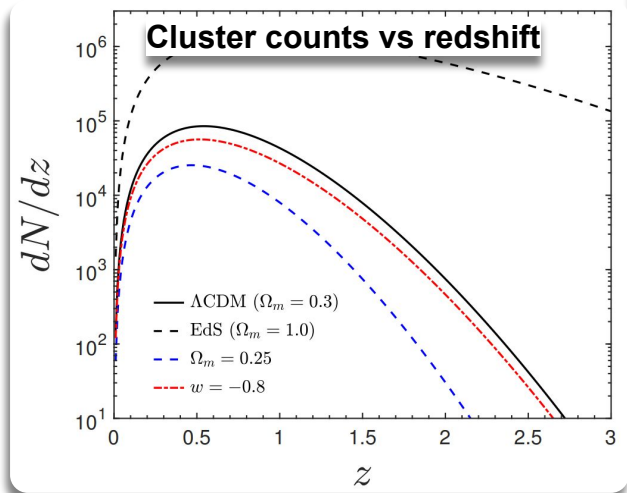


SUNYAEV-ZEL'DOVICH EFFECT

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



time

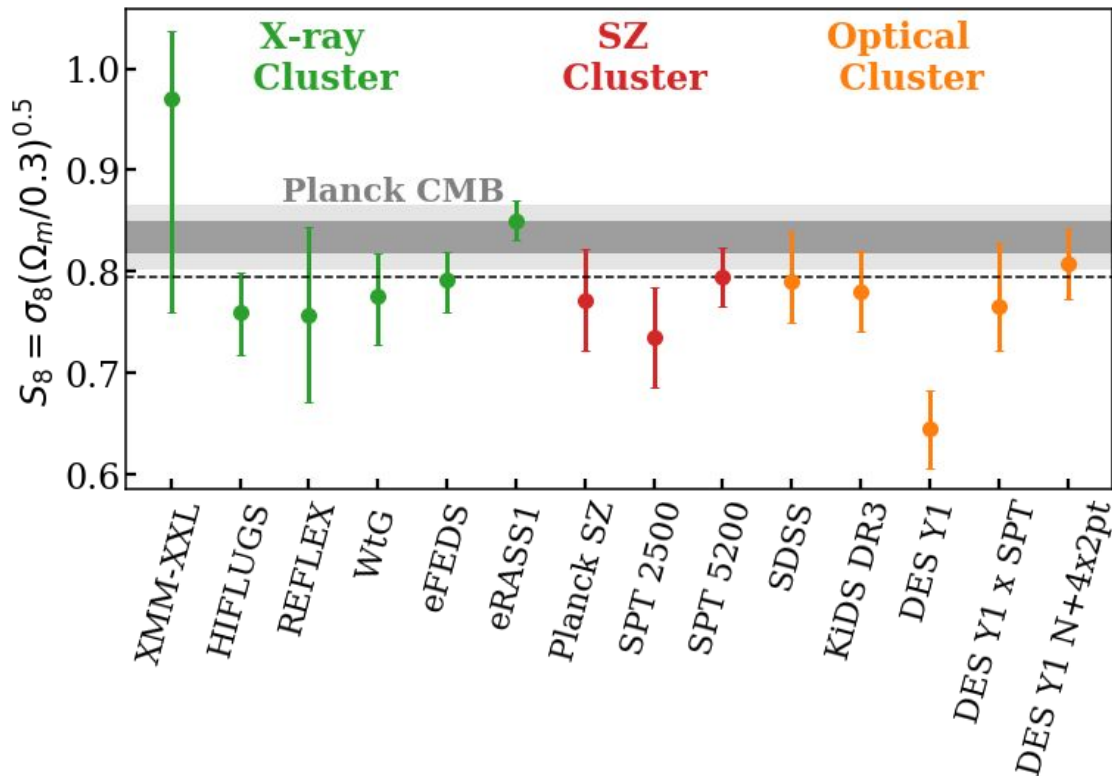
From Borgani, Guzzo 2001

# 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

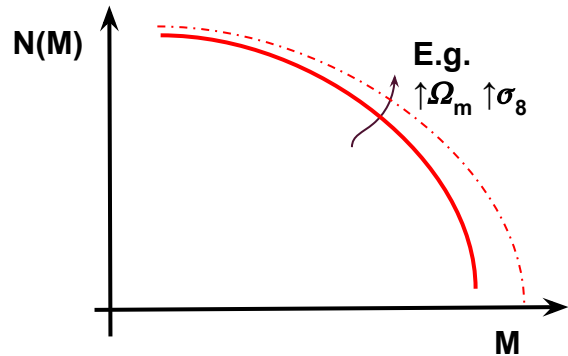


- Amplitude of matter fluctuations,  $\sigma_8$
- Total matter density,  $\Omega_m$
- Dark energy equation of state parameter  $w$
- Total neutrino mass,  $\Sigma m_\nu$
- Modified gravity models
- ...

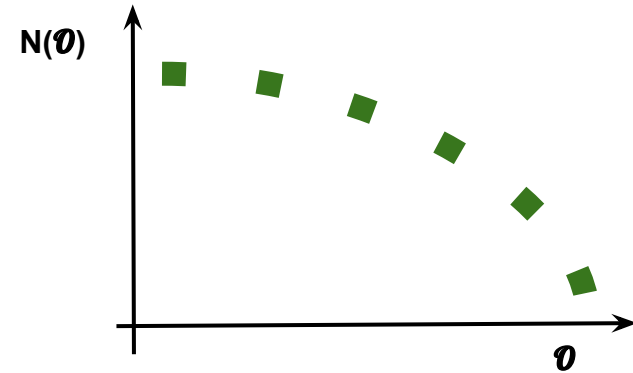


# FROM OBSERVATION TO COSMOLOGICAL CONSTRAINTS

Theoretical prediction



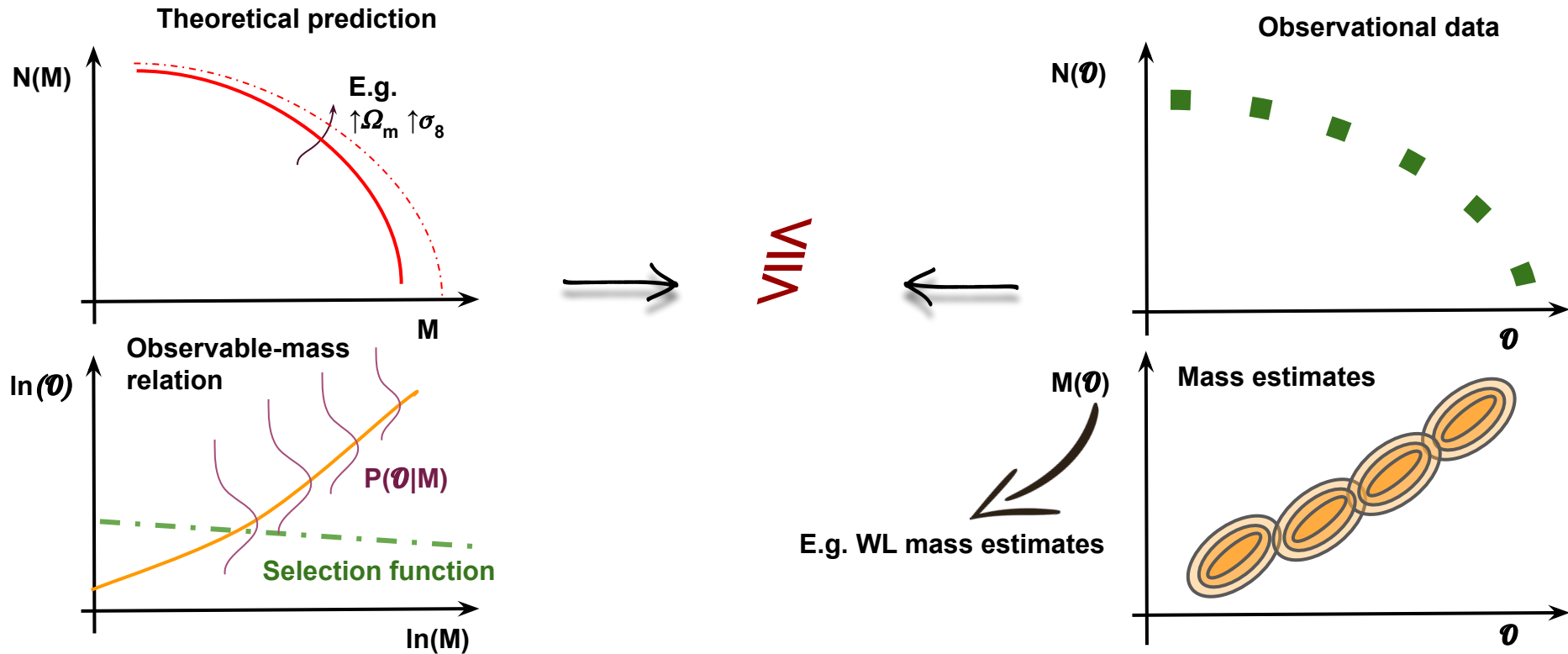
Observational data



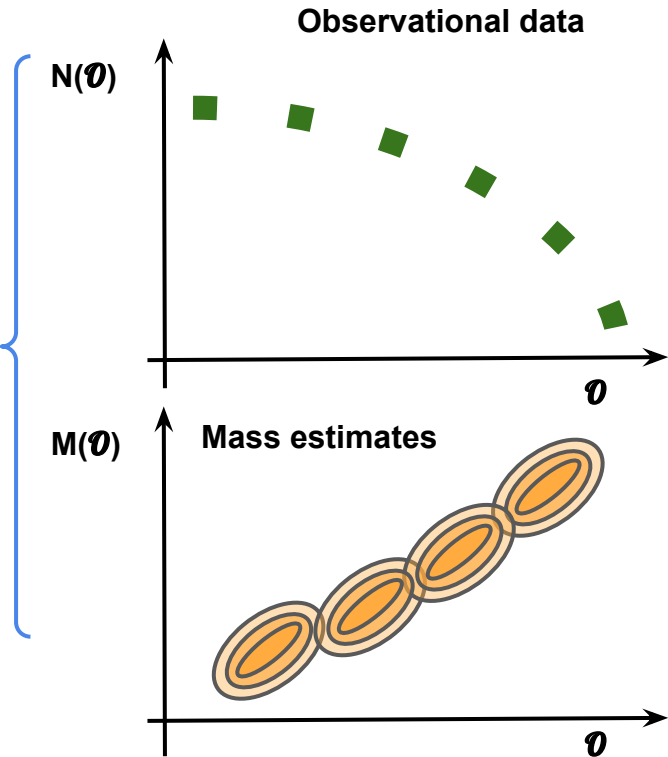
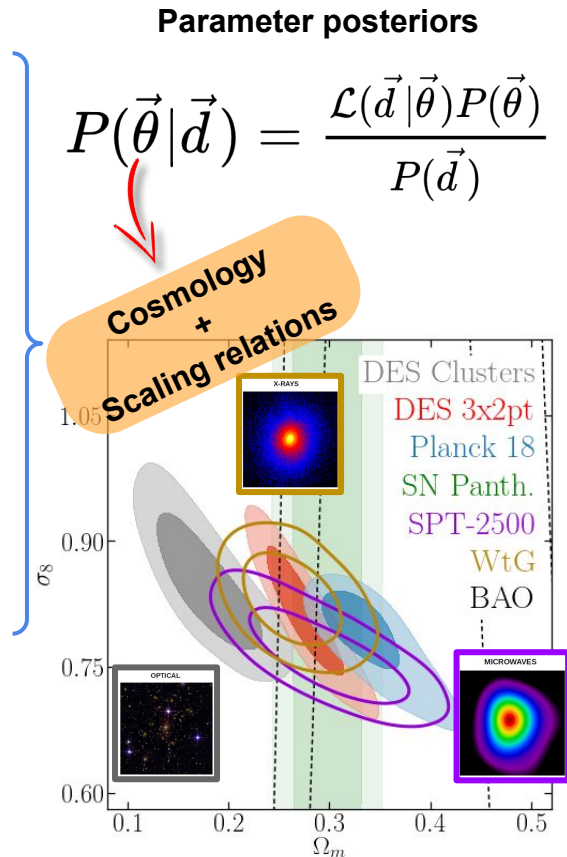
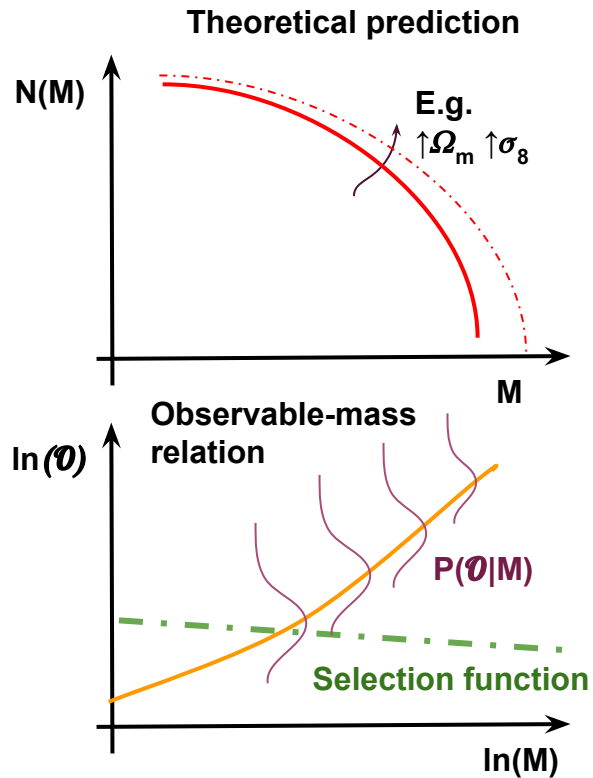
E.g.:

- Richness
- X-ray luminosity or photon counts
- SZ signal

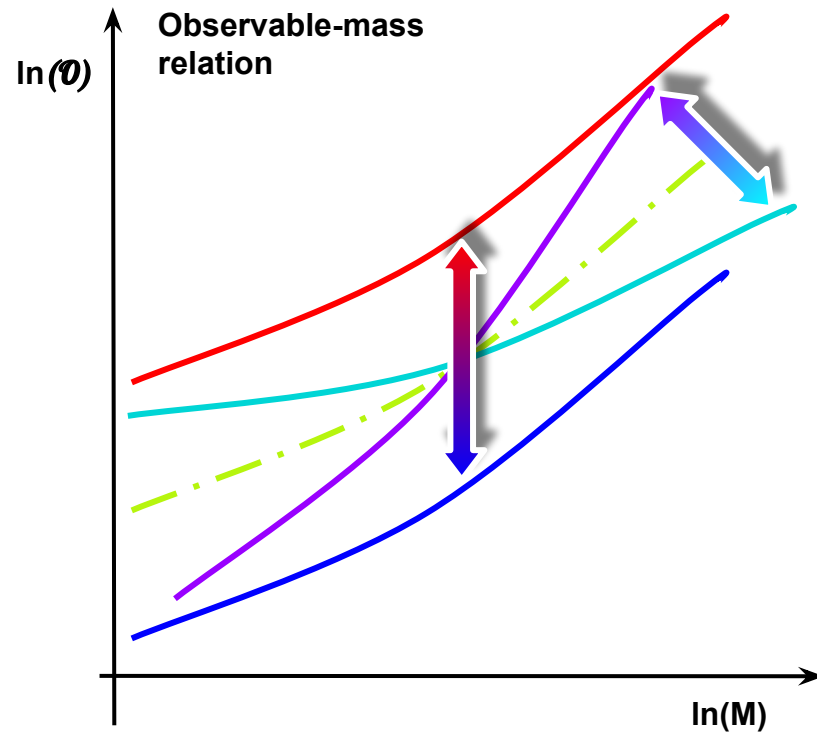
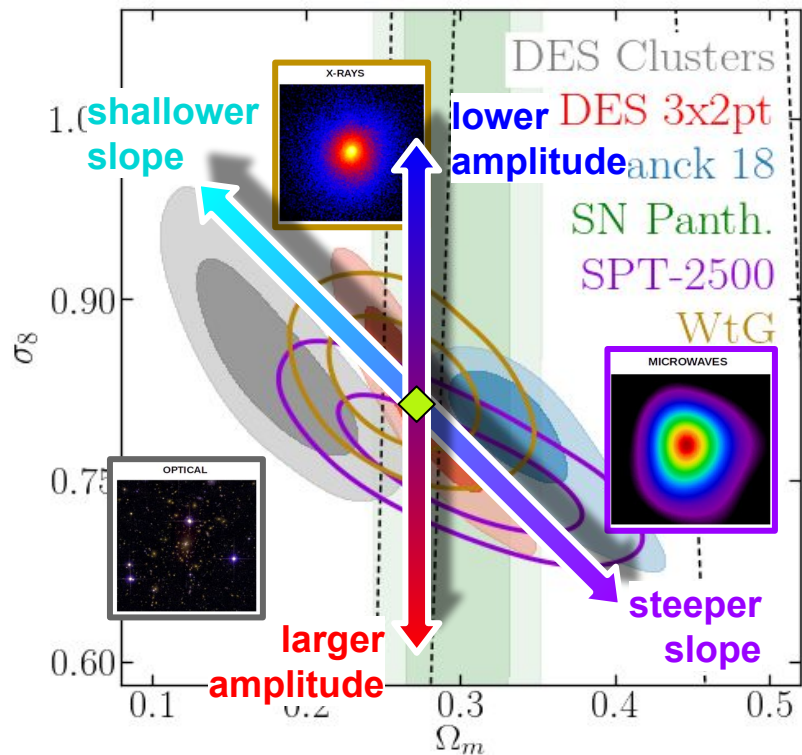
# FROM OBSERVATION TO COSMOLOGICAL CONSTRAINTS



# FROM OBSERVATION TO COSMOLOGICAL CONSTRAINTS

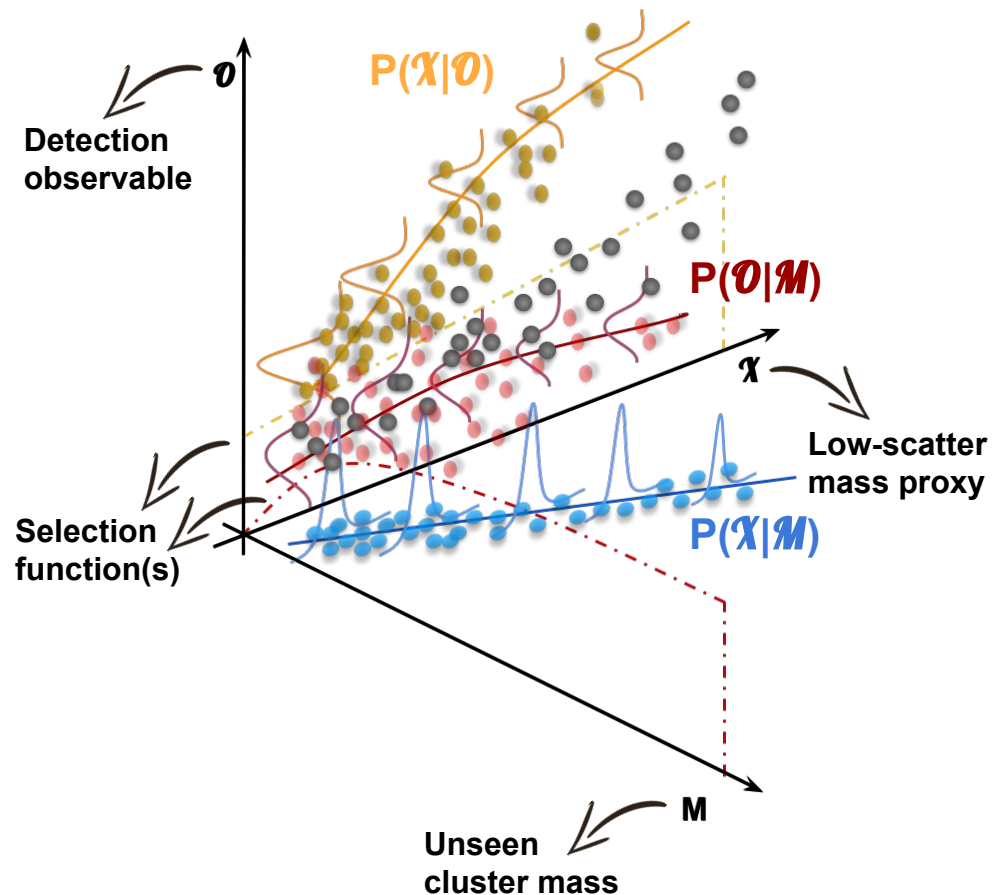


# MASS CALIBRATION AND COSMOLOGICAL POSTERiors





# SELECTION FUNCTION AND MASS CALIBRATION



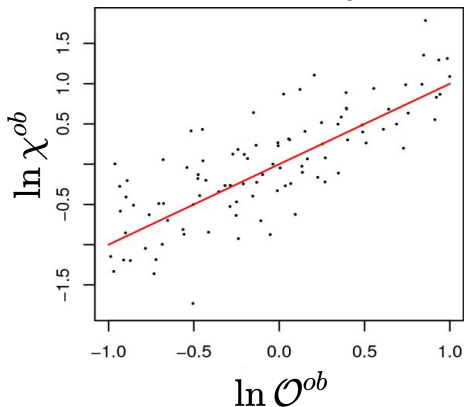
Different detection techniques imply different mass proxies, mass calibration data and systematics.

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

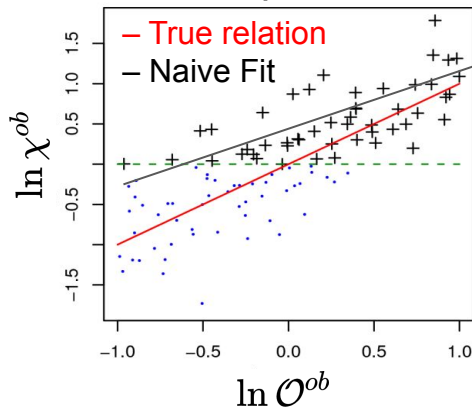
- Well defined selection function(s)
- A model to describe the parent distribution as a function of mass (halo mass function)
- A model to describe the PDF of the multivariate observable space:  $P(\chi, O | M)$

# SELECTION FUNCTION AND MASS CALIBRATION

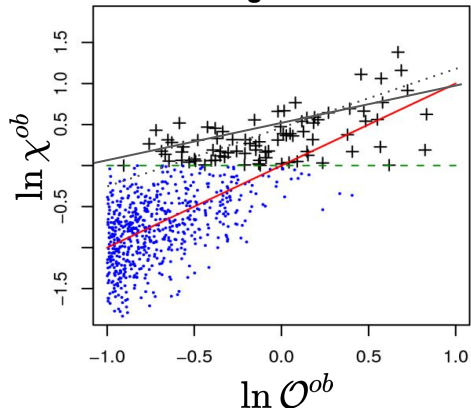
Idealized sample



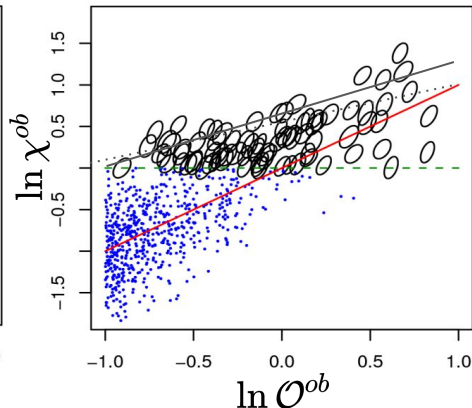
Malmquist bias



Eddington bias



Correlated scatter



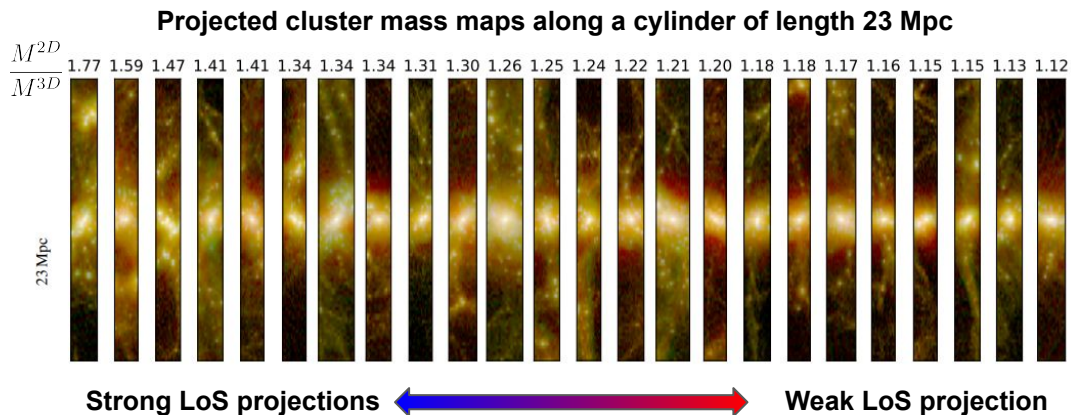
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The calibration of the observable-mass relation(s) requires:

- Well defined selection function(s)
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# CORRELATION BETWEEN MULTI- $\lambda$ OBSERVABLES

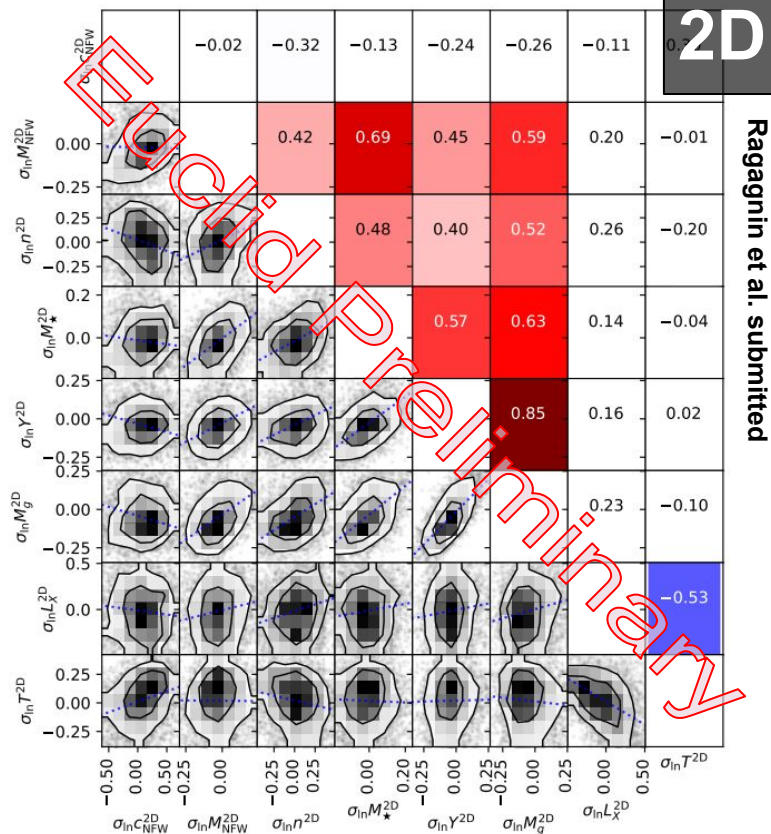
- Observationally, we only have access to projected quantities.



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

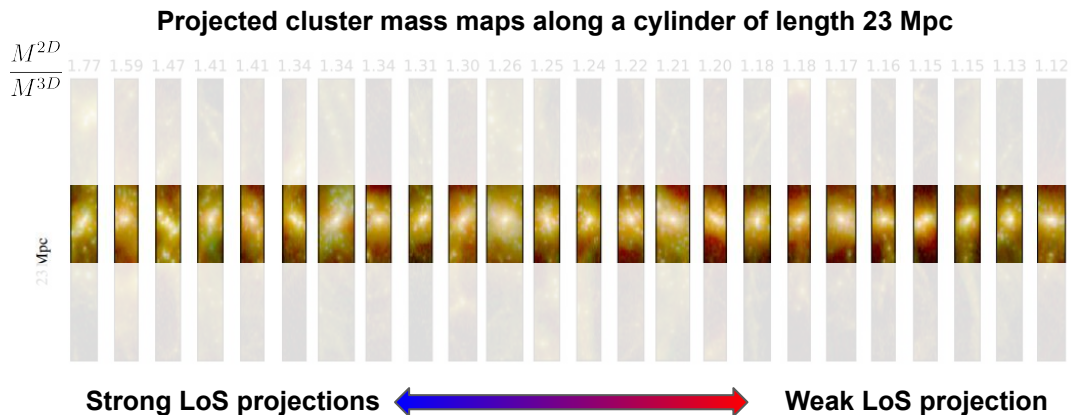
See also e.g. Farahi et al 2019

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



# CORRELATION BETWEEN MULTI- $\lambda$ OBSERVABLES

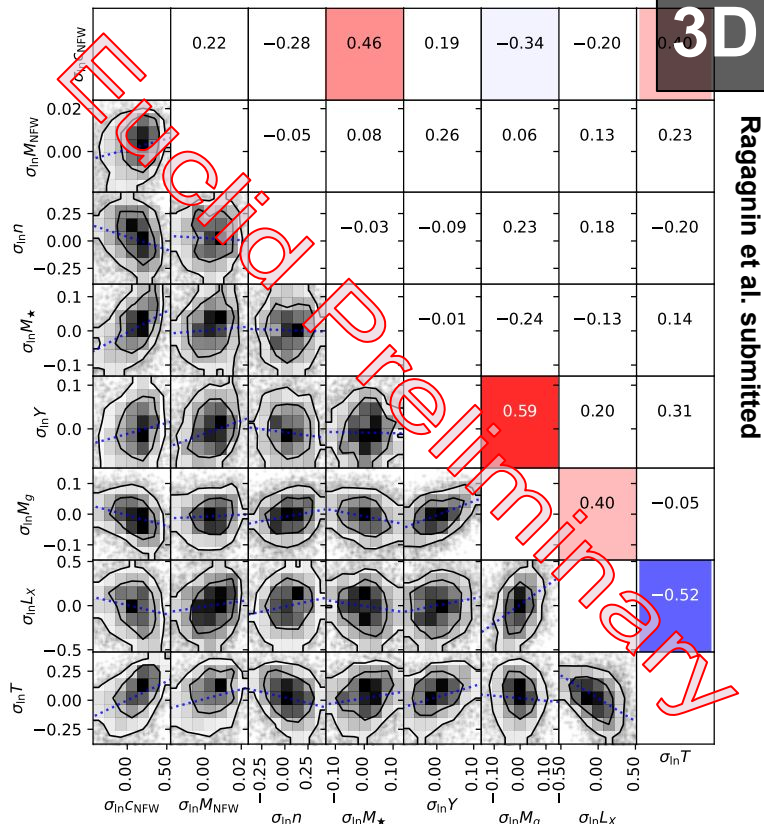
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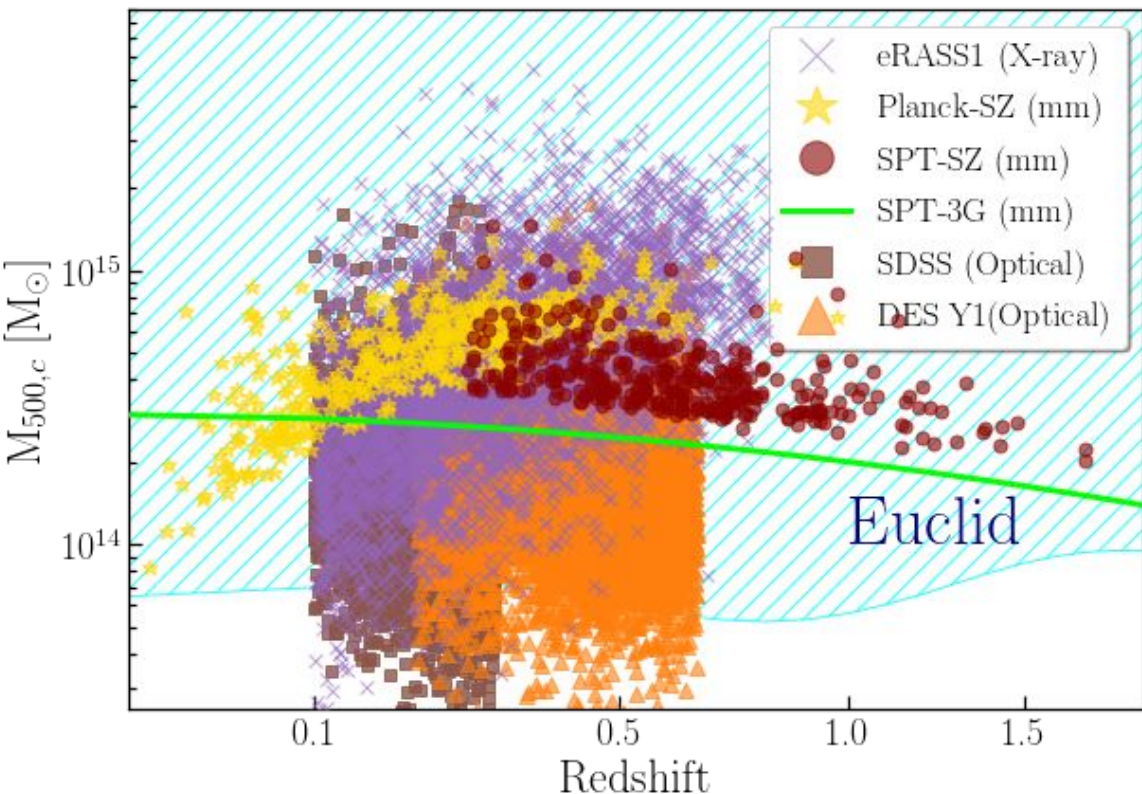
- Line-of-sight projections increase the scatter and skewness of the Obs-Mass relations and introduce correlations between observables measured at different wavelengths

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 3D observables






# CLUSTER CATALOGUES AT DIFFERENT $\lambda$ s



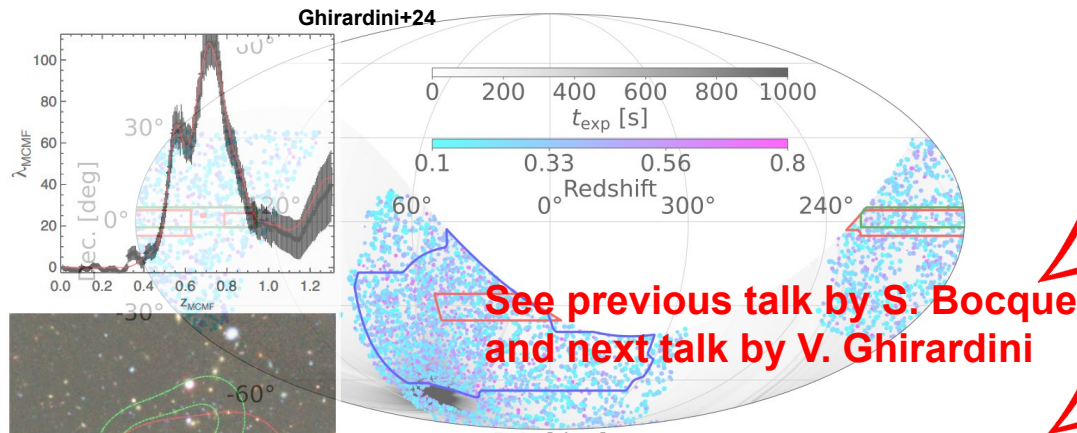
## • X-ray, SZ:

- 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 

## • Optical:

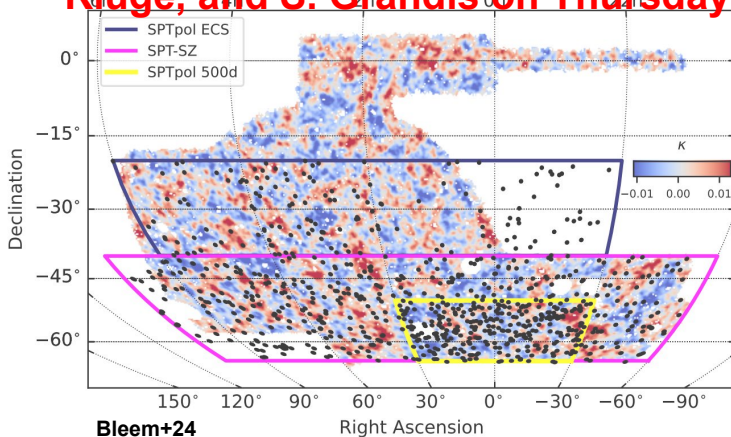
- Lower mass limit  $M \sim 5 \cdot 10^{13} M_{\odot}$  
- Selection function hard to model 
- WL and photo-z data readily available 

# CLUSTER CATALOGUES AT DIFFERENT $\lambda$ s





See previous talk by S. Bocquet and next talk by V. Ghirardini




See previous talk by F. Balzer and M. Kluge, and S. Grandis on Thursday



- 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 

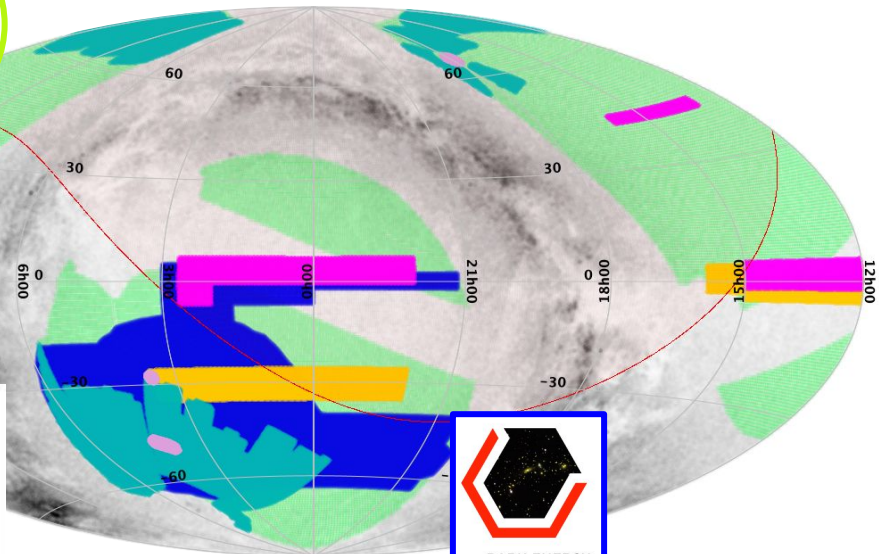
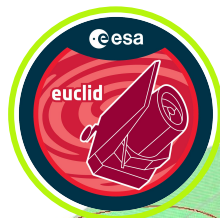
- Optical:

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

# CLUSTER CATALOGUES AT DIFFERENT $\lambda$ s

## Euclid:

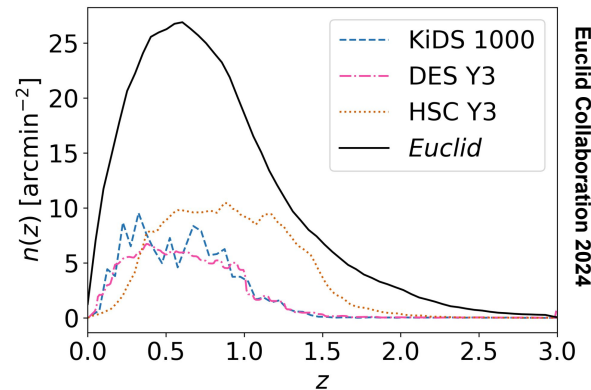
- Optical and IR bands + slitless spectroscopy
- $\sim 15000 \text{ deg}^2$ ,  $0.2 < z < 2.0$  (DR1  $\sim 1700 \text{ deg}^2$ )



## DES:

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

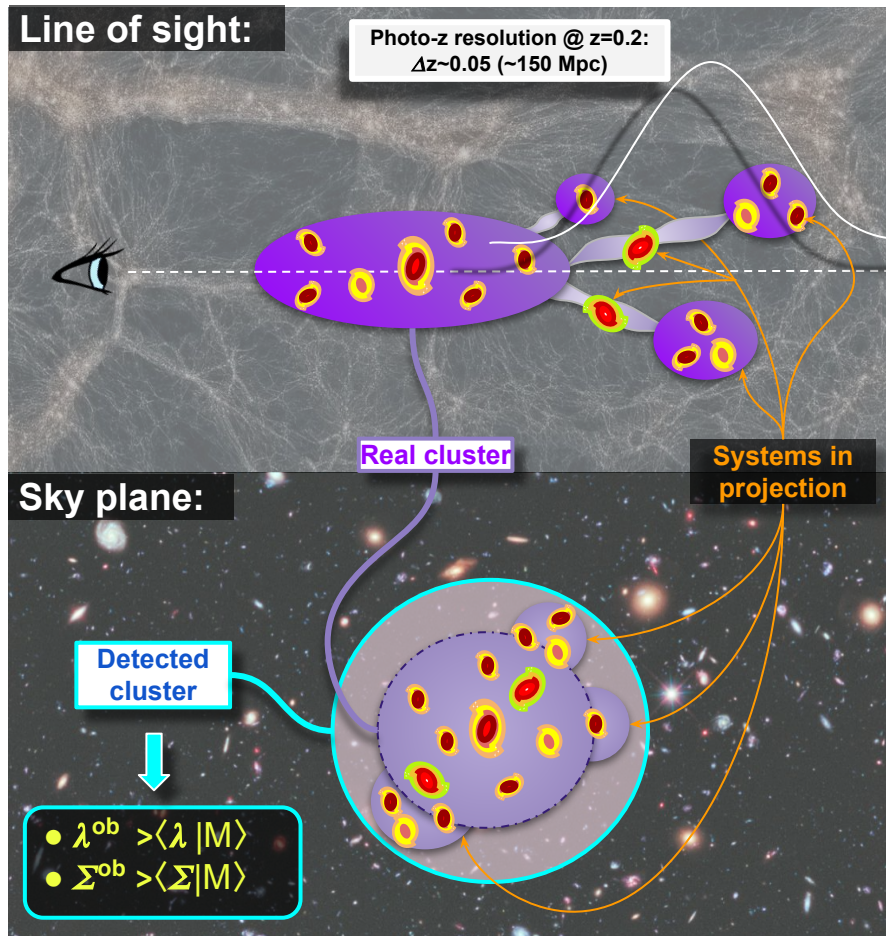
## Source density vs redshift



## Optical:

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

# SELECTION EFFECTS IN OPTICAL CATALOGS



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

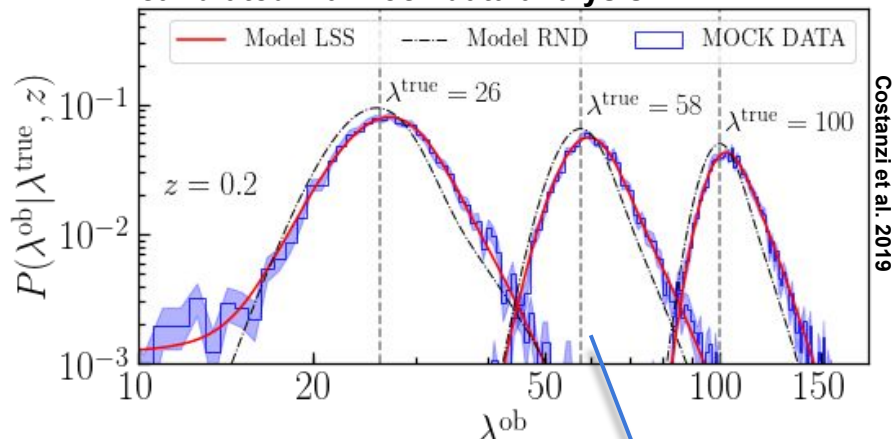


Optical selection bias introduce a correlation between richness and WL signal which needs to be properly modeled to recover unbiased mass estimates

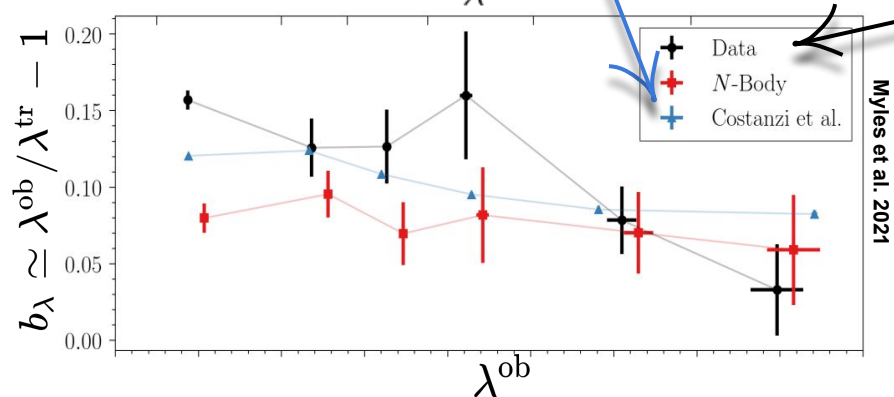


# $\delta\lambda$ CALIBRATION: SPEC-Z DATA

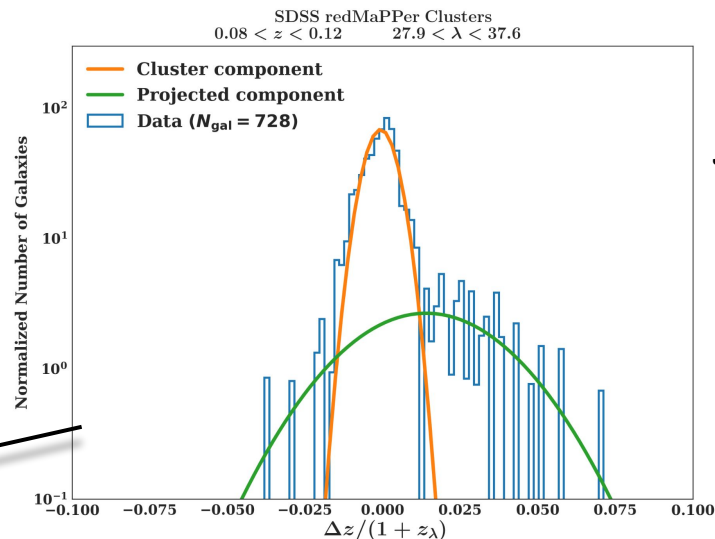
Scatter between true and observed richness calibrated via mock/data analysis



Richness contamination



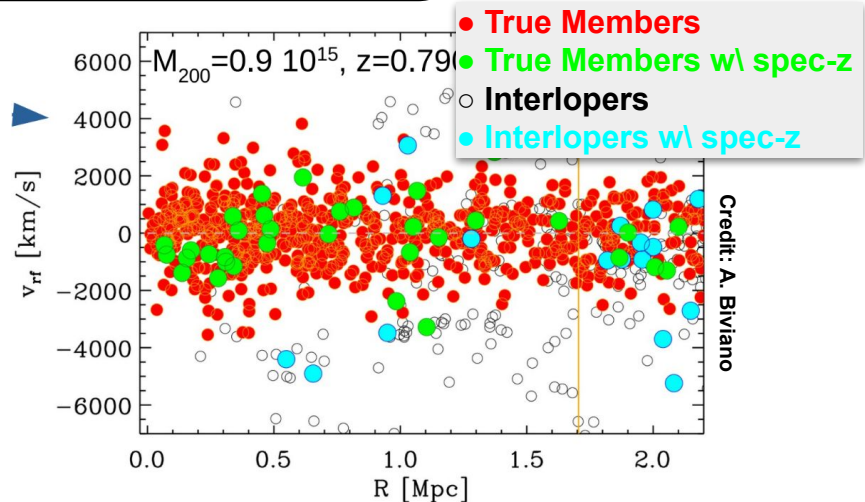
Richness contamination from stacked spec-z data



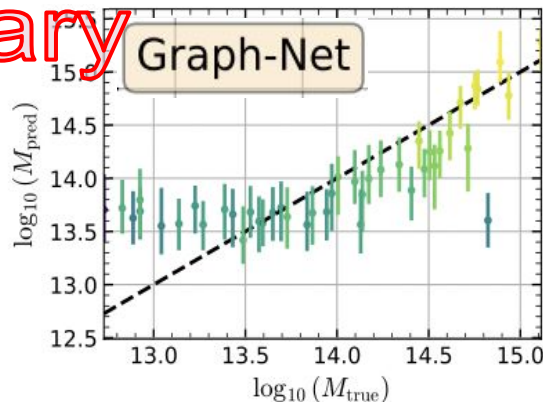
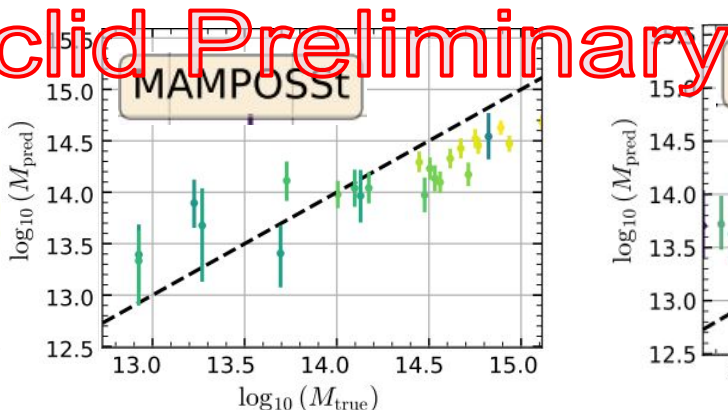
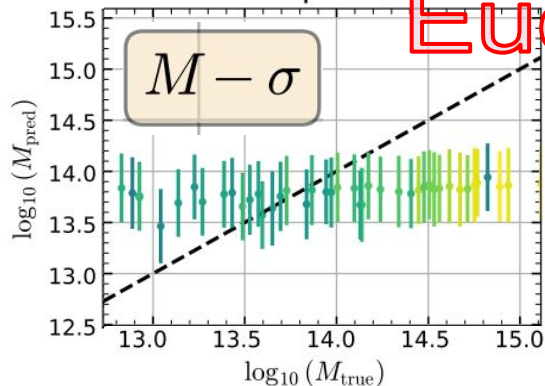
- Spectroscopic data of putative cluster members allow to distinguish between a population of true cluster galaxies and projected interlopers

# 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

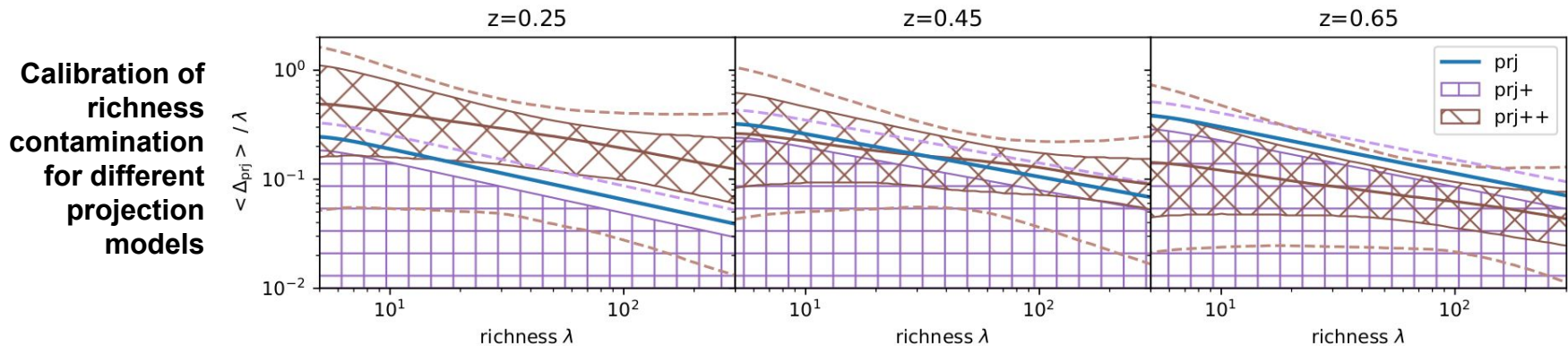
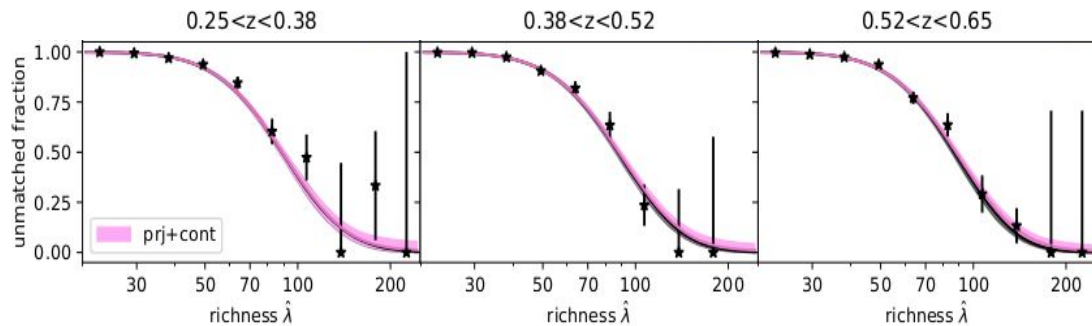
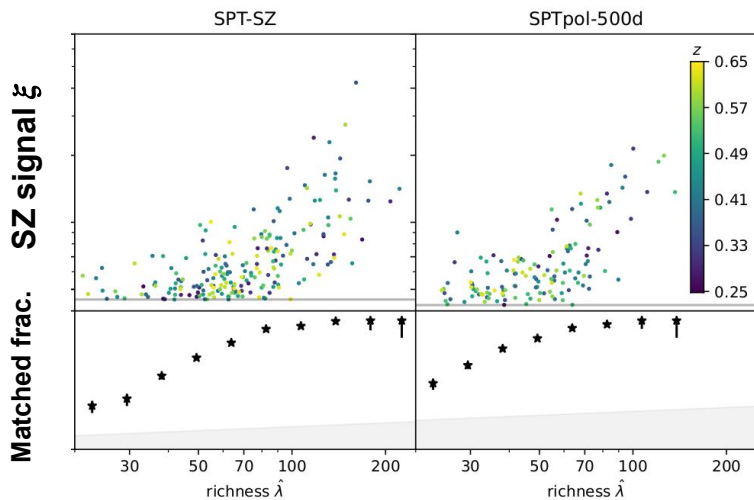


Machine Learning based estimates (Ho et al in prep.)

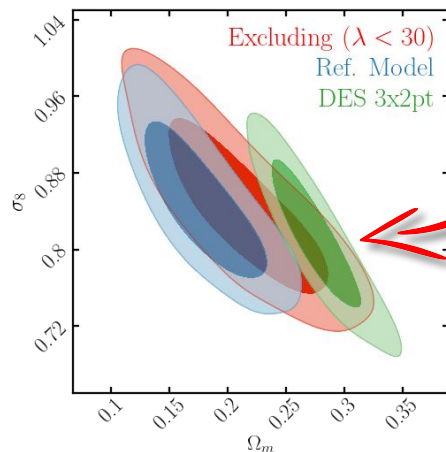
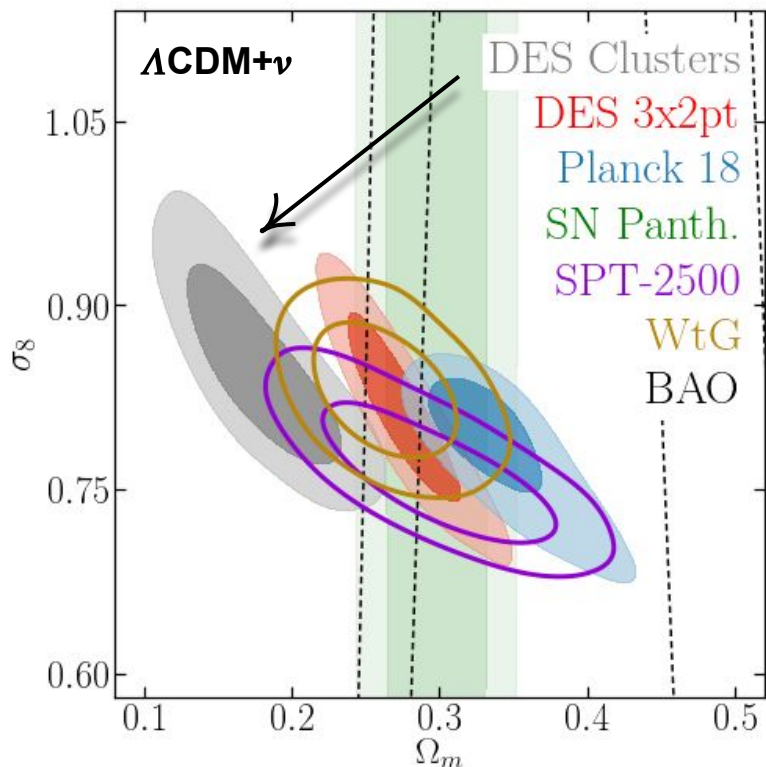


# $\delta\lambda$ CALIBRATION: SZ DATA

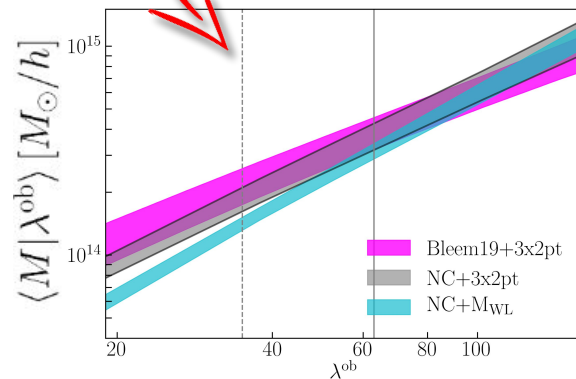
- Use redMaPPer DES Y3 x SPT-SZ/500d/ECS matched and unmatched sample to calibrate projection effects: (Grandis et al in prep; see also Grandis+21)



# SELECTION EFFECT BIAS: LESSON FROM DES Y1



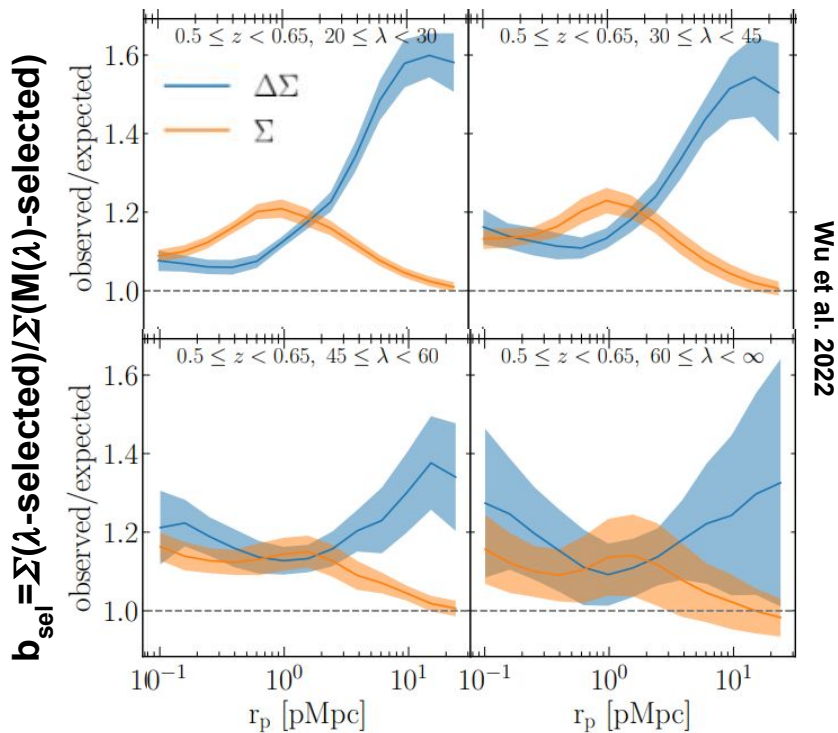
Flawed modeling of the stacked WL signal of  $\lambda < 30$ : Removing the lowest richness bins reduces the tension with DES 3x2pt cosmology changing the slope of the  $\lambda$ -M relation



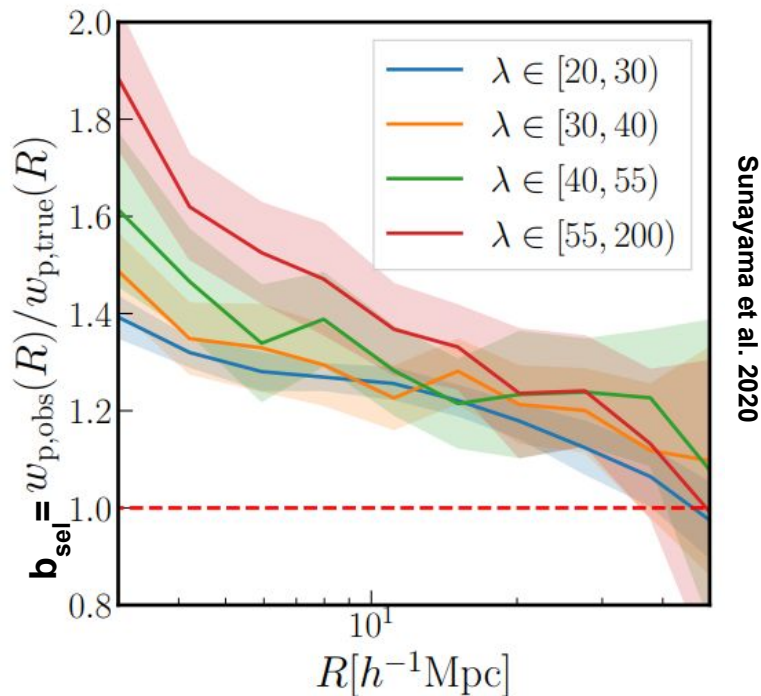
- $2.4\sigma$  tension with DES 3x2pt
- $5.6\sigma$  tension with Planck 18

# SELECTION EFFECT BIAS ON WL AND CLUSTERING

Selection effects bias on WL profile from mock redMaPPer catalogs



Selection effects bias on projected 2-pt correlation function from mock redMaPPer catalogs

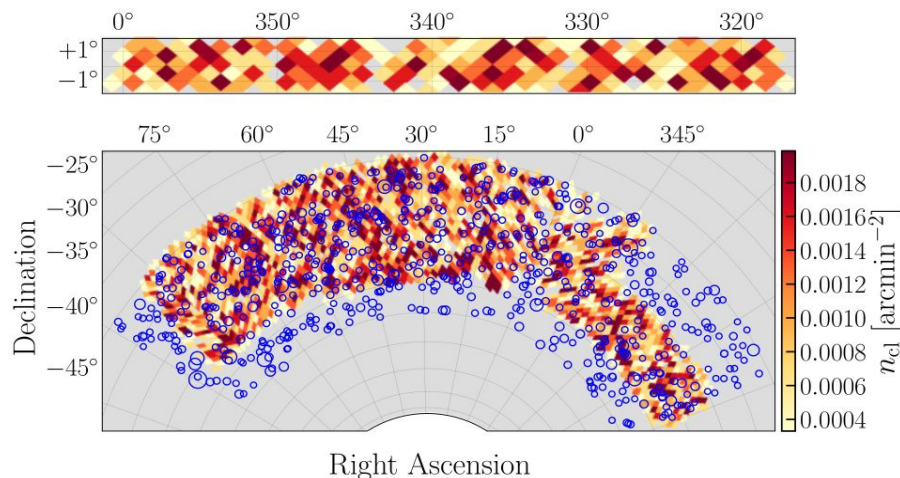


Also see To et al 2022, Zhang et al 2022, Zeng et al 2023

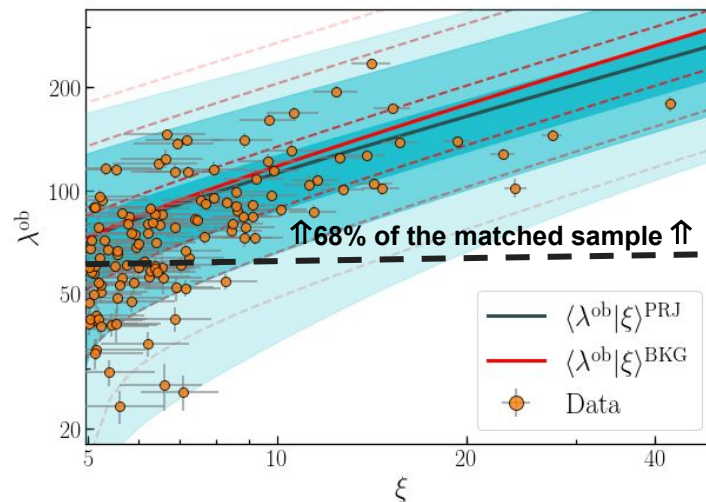
# DES Y1 CLUSTER COUNTS x SPT MULTI- $\lambda$ DATA

- 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



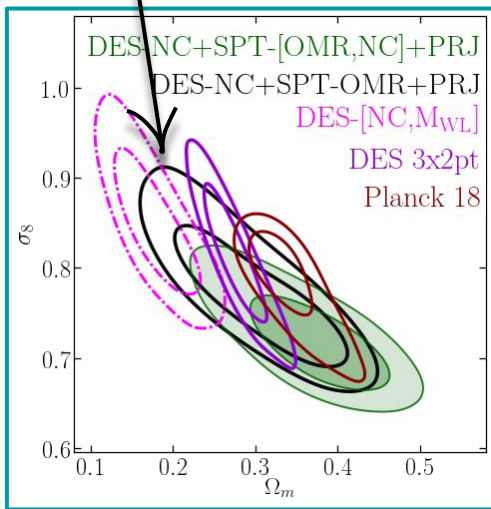
DES Y1-SPT SZ cross matched sample



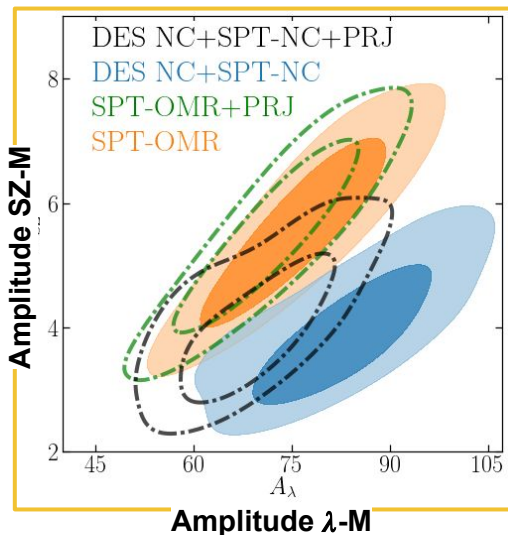
# DES CLUSTER COUNTS x SPT MULTI- $\lambda$ DATA

DES-NC x SPT-multi- $\lambda$  yields results consistent with multiple cosmological probes.

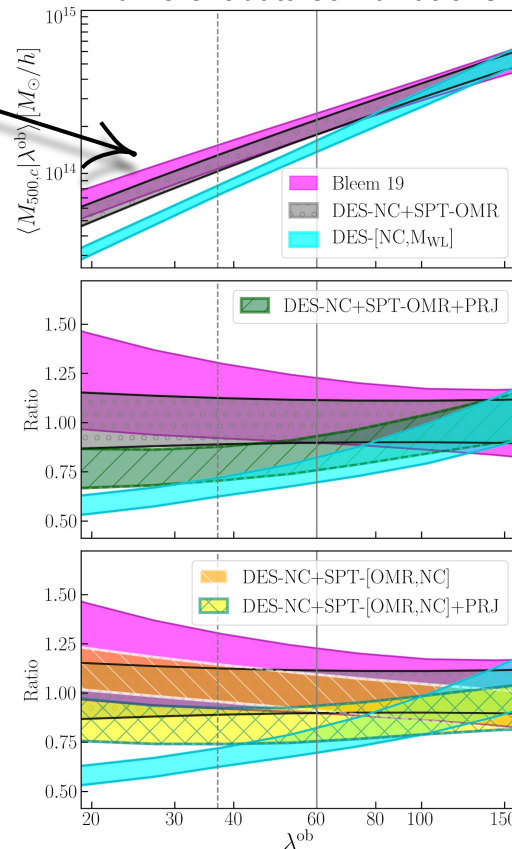
Inclusion of high-redshift SPT NC data serves as a test of different scatter models for  $\lambda^{\text{ob}}$



Costanzi+21

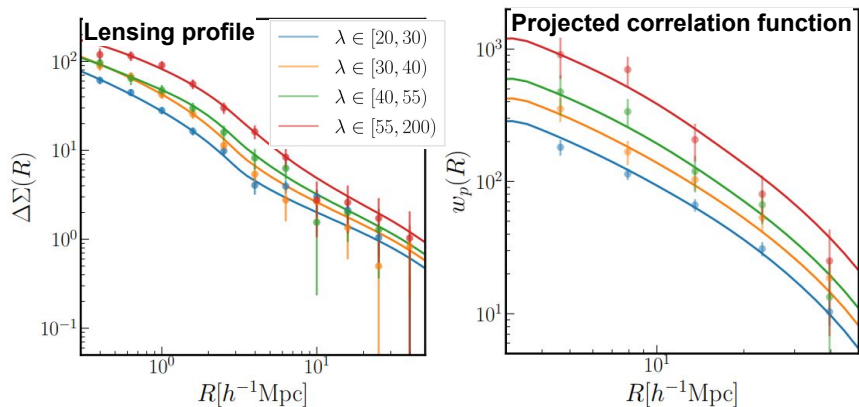


Mass-richness relations for different data combinations



# CALIBRATING SELECTION EFFECT BIAS

## Self Calibration

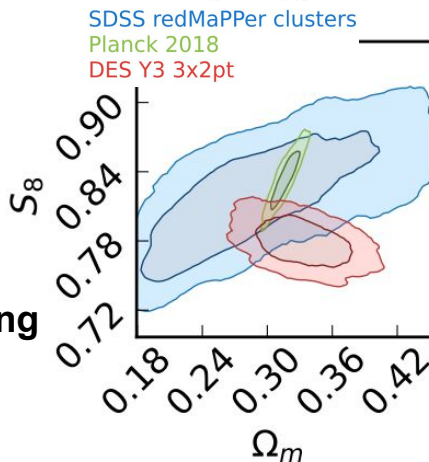


Sunayama et al. 2023

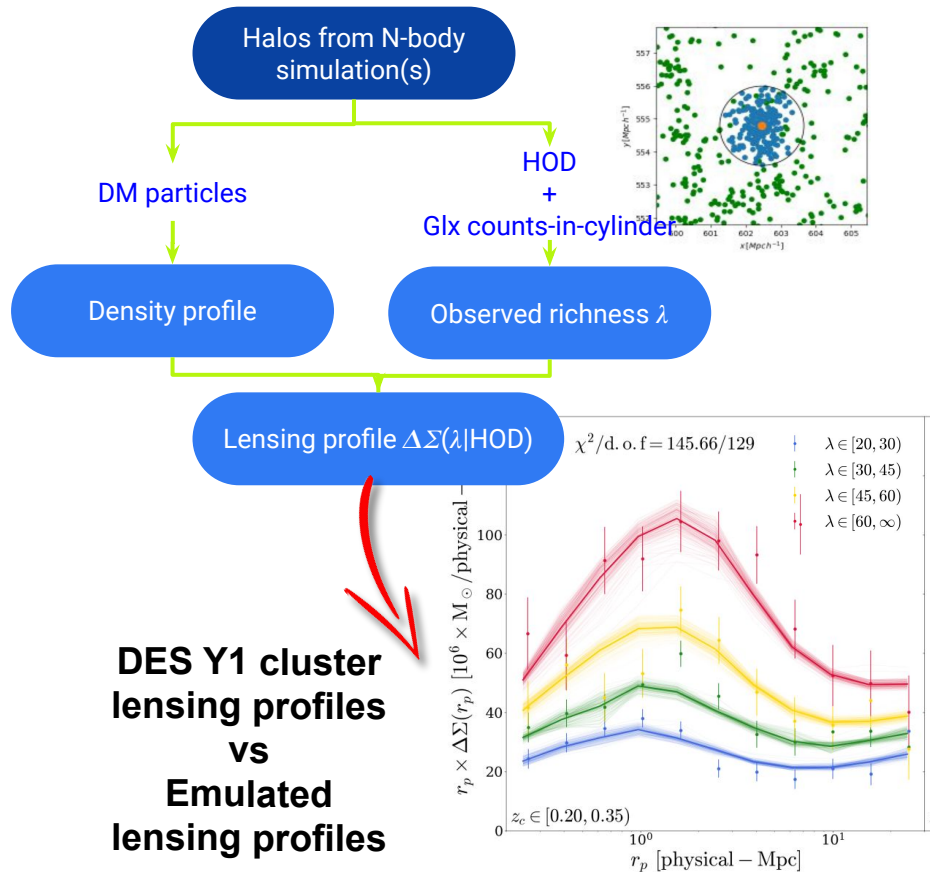
$$w_p(R) = \Pi^2(R)w_p^{\text{iso}}(R),$$

$$\Sigma(R) = \Pi(R)\Sigma^{\text{iso}}(R).$$

Selection bias fitted along with cosmological parameters



## Simulation-based forward modeling

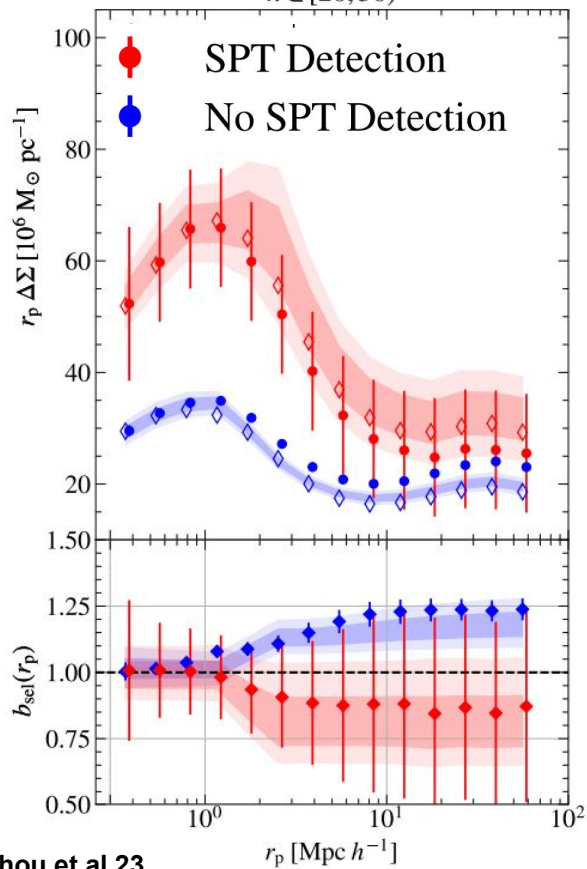




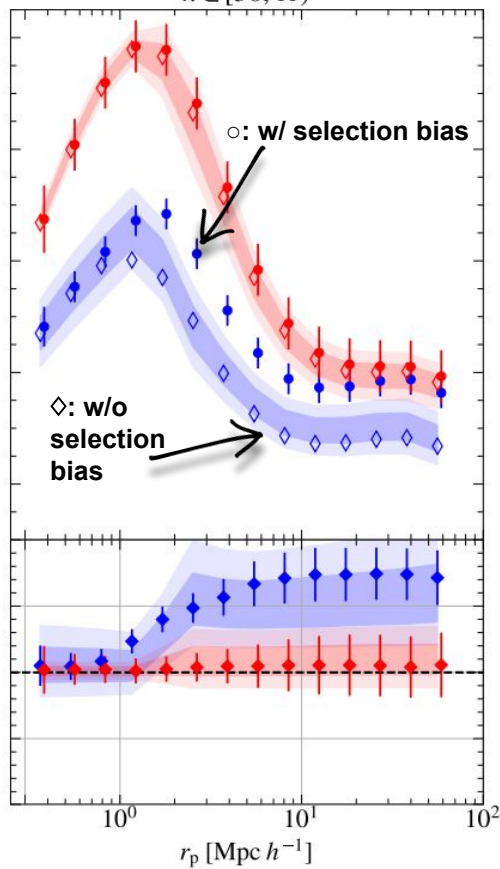
# MULTI- $\lambda$ SELECTION EFFECT BIAS CALIBRATION

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,  $b_{\text{sel}}$

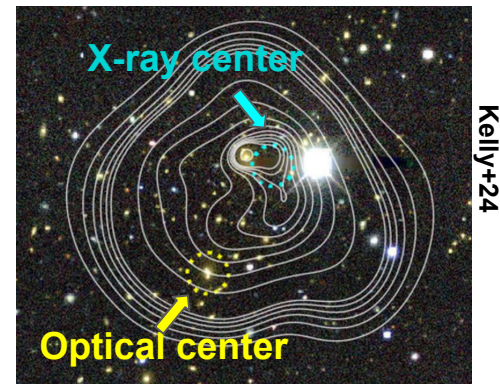


# CLUSTER MISCENTERING: X-RAY CALIBRATION

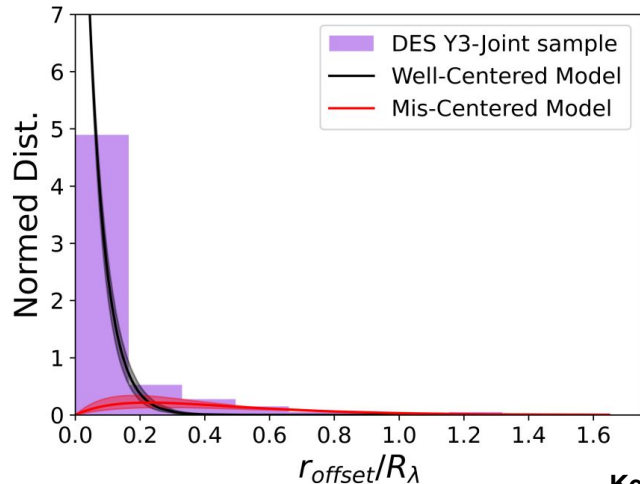
Cluster miscentering caused by: masked data, merging/disturbed clusters, “blue” BCG

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

→ See P. Giles talk on Thursday

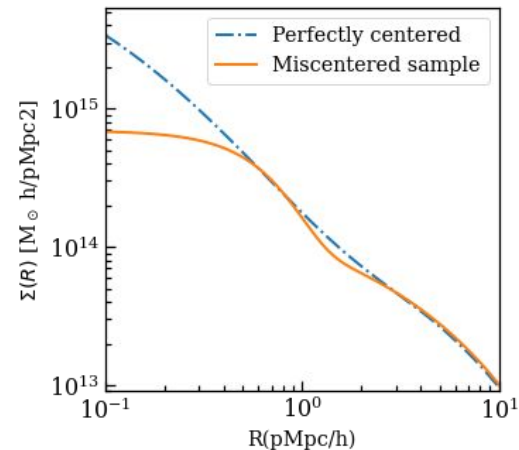
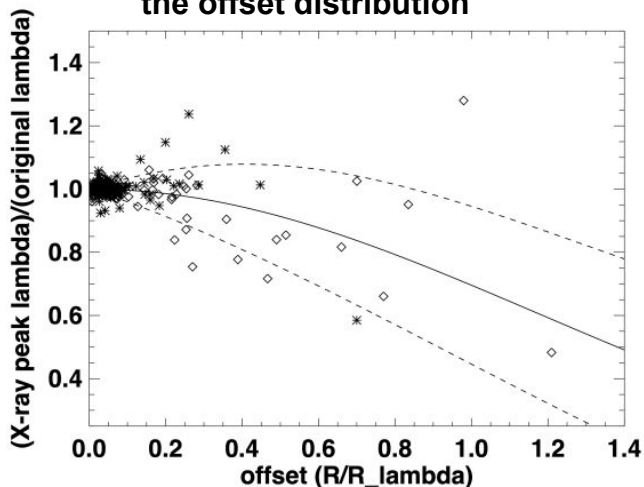


Radial offset distribution calibration using X-ray vs optical center

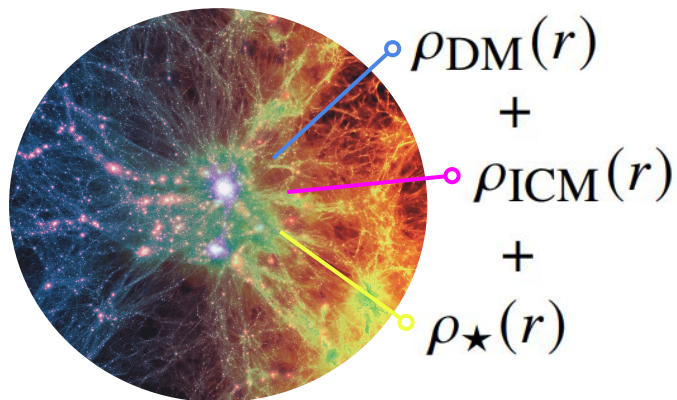


Kelly+24

Richness perturbation as a function of the offset distribution

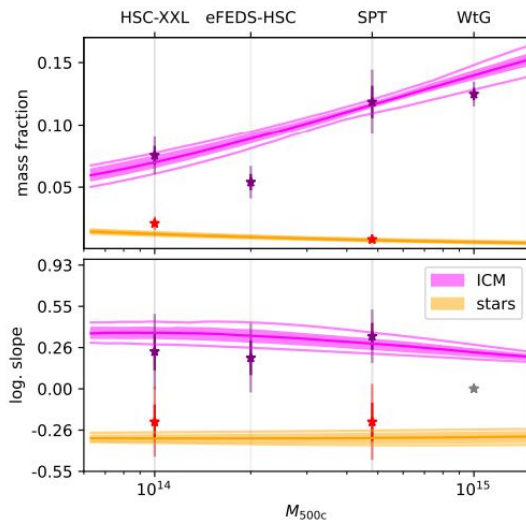


# BARYONIC FEEDBACK CALIBRATION WITH GC MULTI- $\lambda$

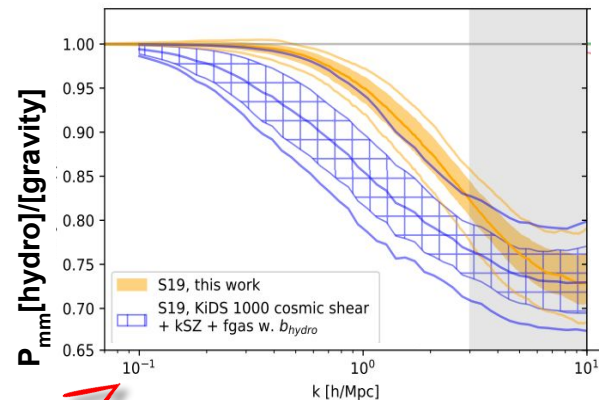


- Multi- $\lambda$  data provide a means to probe the gas (X-ray, SZ) and stellar (optical/IR) components of clusters
- Combining gas and stellar mass measurements with halo mass estimates (e.g. from WL) it is possible to constrain the modulation of the matter clustering due to baryonic feedbacks

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



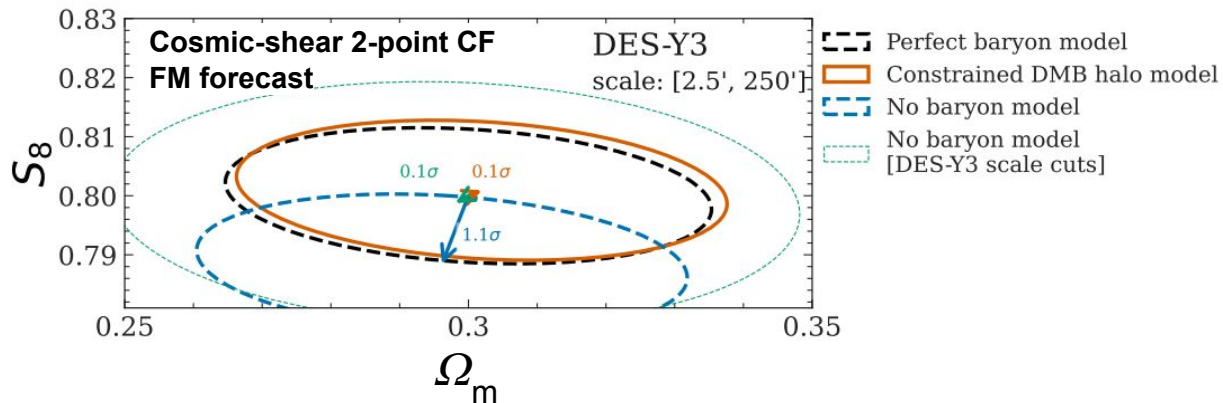
Matter power spectrum suppression due to baryonic feedbacks



Grandis+24

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

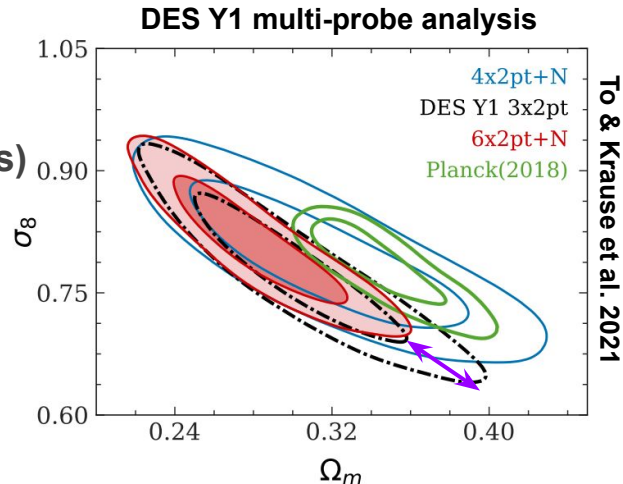
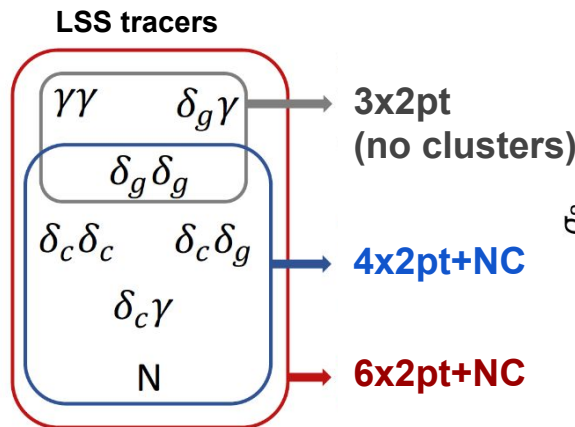
# MULTI-PROBE COSMOLOGY WITH GCs



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

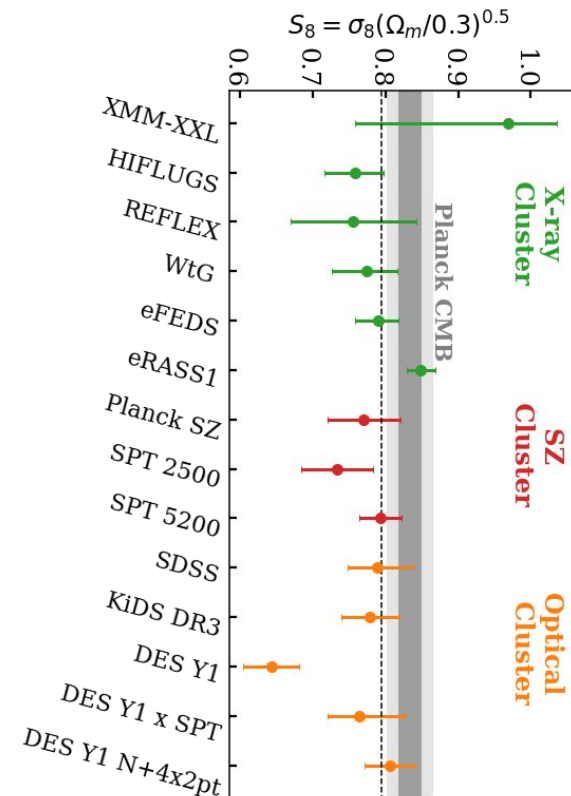
To+24

- When combined with other probes of the LSS, cluster data entail a sizeable improvement of the constraints in the  $\sigma_8 - \Omega_m$  plane



# TAKEAWAY & FUTURE DIRECTIONS

- Galaxy clusters, with their multi-component nature, offer a unique opportunity to study and characterize a cosmological probe across the electromagnetic spectrum.
- There is no such thing as “standalone” X-ray, mm or optical cluster cosmology: Cluster catalogs selected at all wavelengths require multi-wavelength data to derive competitive and unbiased cosmological constraints.
  - Recent cluster analysis results across different wavelengths are consistent among themselves and other probes, reinforcing the robustness of current multi-wavelength approaches.
  - The full potential of optical cluster catalogs is currently limited by the lack of multi-wavelength data, particularly at low richness and high redshift. However, this is set to improve with the increased sensitivity and depth of upcoming X-ray and SZ surveys (e.g. eROSITA 4.5y, SPT-3G, AdvACT).



# TAKEAWAY & FUTURE DIRECTIONS

- Clusters have the potential to deliver the most precise single-probe cosmological constraints, provided that systematics in mass estimates can be accurately characterized ( $\sim 2\%$  level).
- With the substantial overlap of ongoing and upcoming wide-field cluster surveys across X-ray, mm, and optical wavelengths, future cluster cosmology studies should aim to leverage the potential of a full multi- $\lambda$  data combination.
- Galaxy clusters should be regarded as a key ingredient of multi-probe analyses: combined with other probes of the LSS, (multi- $\lambda$ ) cluster data is capable of constraining astrophysical parameters and breaking cosmological degeneracies greatly improving the overall constraining power.

