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## Weak lensing cluster masses in the LSST DESC simulations

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# Cosmology with galaxy cluster abundance

Galaxy clusters:

- Are the largest gravitationally bound objects in the Universe
- Mass  $> 10^{14}$  solar masses
- Richness  $\lambda$ : linked to the number of galaxies within a cluster
- LSST : Rubin observatory will detect  $\mathcal{O}(10^5)$  galaxy clusters

Cosmology with galaxy clusters

- Cluster abundance : Count the number of clusters in redshift & richness intervals.
- Cluster abundance is a useful probe for cosmology.

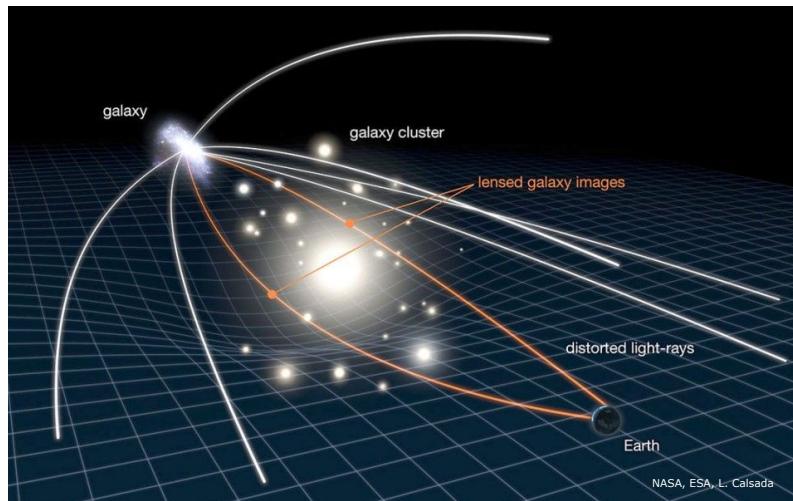
In a redshift and richness bin, the expected cluster abundance is given

$$N = \Omega_s \int_{z_\alpha}^{z_\beta} dz \frac{d^2 V(z)}{dz d\Omega} \int_{\lambda_{\alpha'}}^{\lambda_{\beta'}} d \ln \lambda \int_{M_{\min}}^{M_{\max}} dm \frac{dn(m, z)}{dm} P(\ln \lambda | m, z)$$

differential comoving volume (cosmology)      Halo mass function (cosmology + large scale structure formation)      Mass-richness relation

Weak lensing is a powerful tool to constrain galaxy cluster masses.

# Weak gravitational lensing



- Gravitational lensing modifies the observed background galaxy shapes.
- Distortion is sensitive to the excess surface mass density around the cluster  $\Delta\Sigma$ .
- Taking the average observed ellipticities of galaxies at a distance  $R$ :

$$\widehat{\Delta\Sigma}(R) = \langle \Sigma_{\text{crit}}(z_s, z_l) e_{+,s} \rangle |_R$$

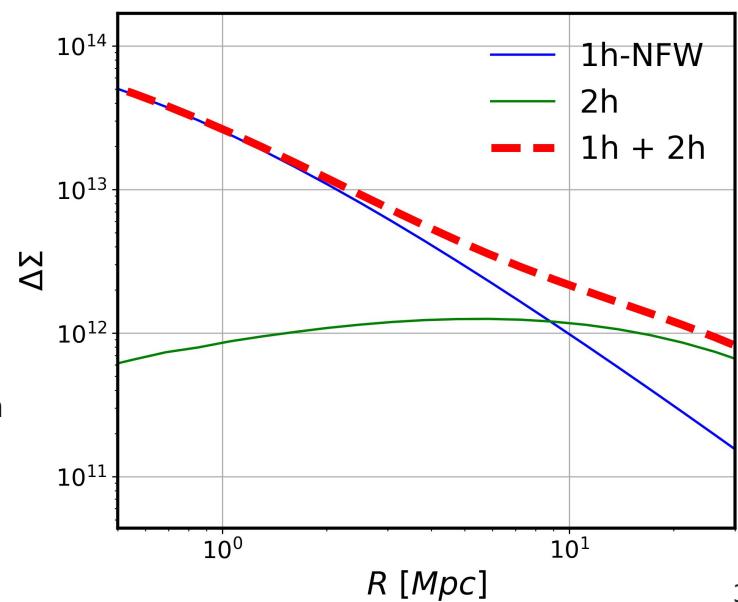
Tangential ellipticity

- The predicted shear signal is given by the sum of two contributions;

$$\boxed{\Delta\Sigma(R)} = \boxed{\Delta\Sigma_{\text{single}}(R)} + \boxed{\Delta\Sigma_{2h}(R)}$$

1h-term: depends on the single halo mass (< 5 Mpc)

2h-term: contribution from neighboring halos (power spectrum, halo bias)



# Stacked shear estimation

- Stacked shear signal :
  - measurement of the shear for an ensemble of cluster within a redshift and richness bin

$$\widehat{\Delta\Sigma}(R) = \frac{1}{\sum W_l} \sum_{l=1} W_l \widehat{\Delta\Sigma}_l(R)$$

$W_l$  = include effect of shape measurement and photometric redshift errors of background galaxies

# Weak lensing mass estimation

1. Modelling the excess surface density :
  - a. 1-halo term NFW : depends on the mass and concentration, use of concentration-mass (c-M) relation for the fit of the single mass (Diemer, Krastov, 2015)
  - b. 1-halo + 2-halo term (halo bias : Thirker, 2010)
2. Likelihood for mass estimation :
  - a. Errors on  $\Delta\Sigma$ , estimated by bootstrap resampling

$$\ln L(\theta) \propto - \sum_{i=1} \left( \frac{\widehat{\Delta\Sigma}(R_i) - \Delta\Sigma_{\text{th}}(R_i)}{\sigma_{\widehat{\Delta\Sigma}}(R_i)} \right)^2$$

|        | 1h            | 1h + 2h        |
|--------|---------------|----------------|
| c-M    | 1 < R < 5 Mpc | 1 < R < 10 Mpc |
| Free c | 1 < R < 5 Mpc | 1 < R < 10 Mpc |

4 modelling choices

Radial range involved

# The Data Challenge 2 of LSST DESC

- DC2 : based on N-body dark matter simulation ( $440 \text{ deg}^2$ , volume  $(4.2 \text{ Gpc})^3$ ,  $z_{\max} = 3$ )
- Semi-analytical galaxy modelling to produce galaxy catalog

For weak lensing, we need source and lens catalogs

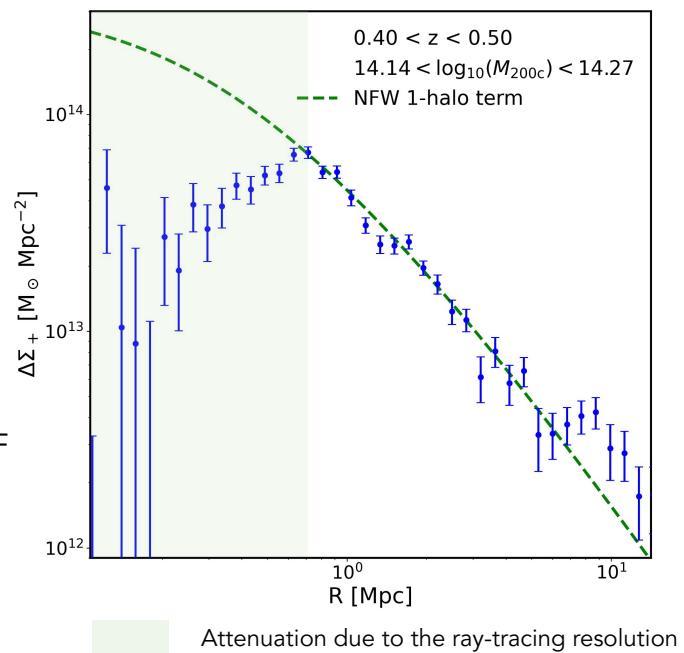
## Galaxy catalog

**cosmoDC2**: known properties of galaxies.

- known redshifts, shear from ray-tracing, magnitudes, intrinsic ellipticities, etc.
- Small scales : non-physical attenuation of the shear signal

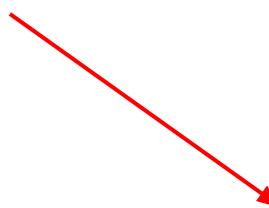
## Lens catalogs

1. Output of cosmoDC2 : catalog of dark matter halos identified by FoF halo finder, with halo properties (mass, triaxiality, etc.)
2. redMaPPer galaxy cluster catalog:
  - Detection of overdensities of red sequence galaxies
  - Richness cut  $> 20$
  - $0.2 < z_{\text{cluster}} < 1.2$



# Workflow

1. Estimation of the “true” mass richness relation
2. Effect of the WL modelling choices of the excess surface density on the mass-richness relation

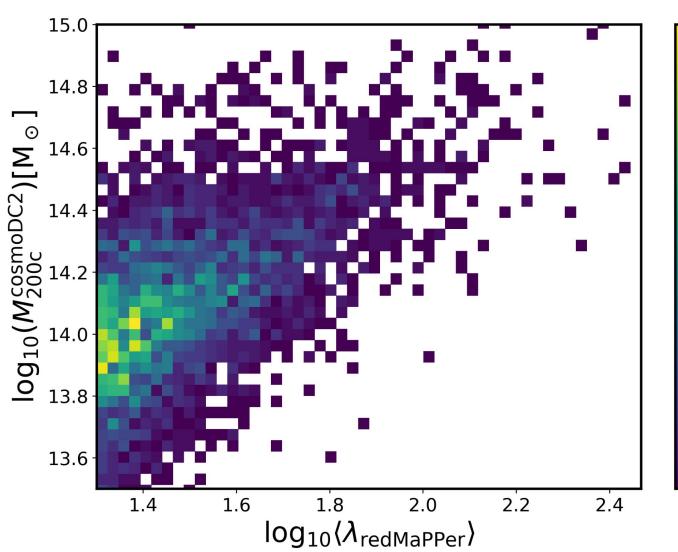


|                    | 1h                      | 1h + 2h                  |
|--------------------|-------------------------|--------------------------|
| c-M relation       | $1 < R < 5 \text{ Mpc}$ | $1 < R < 10 \text{ Mpc}$ |
| Free concentration | $1 < R < 5 \text{ Mpc}$ | $1 < R < 10 \text{ Mpc}$ |

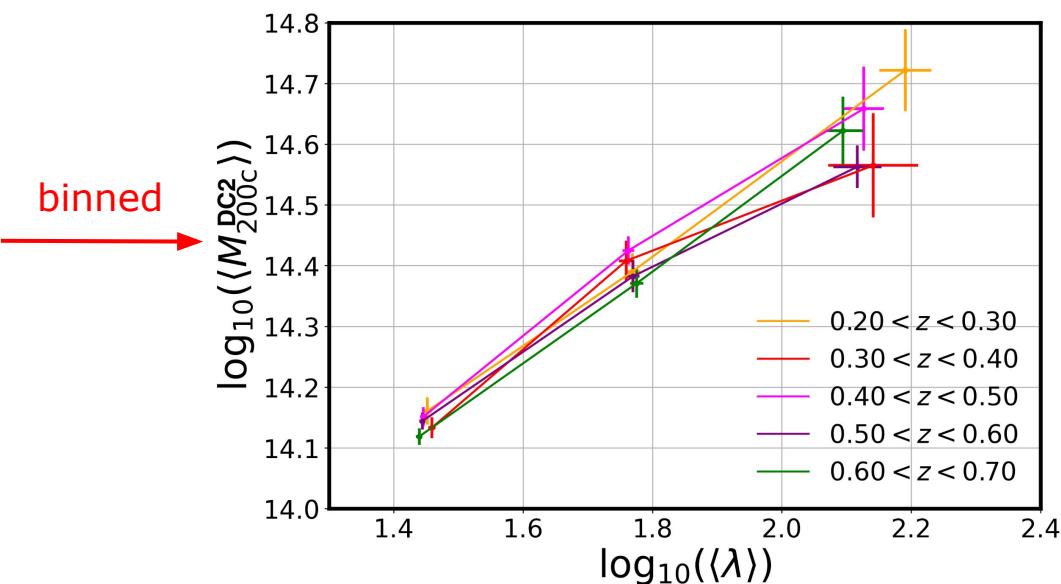
# "True" mass-richness relation

Build an individual mass-richness-redshift catalog :

- Perform a geometrical match of redMapper detected clusters with cosmoDC2 dark matter halos
- After matching, each cluster have DC2 halo mass, redMaPPer richness, redshift.



Individual Mass-richness relation in the M200c-richness plan (approx 4000 clusters)

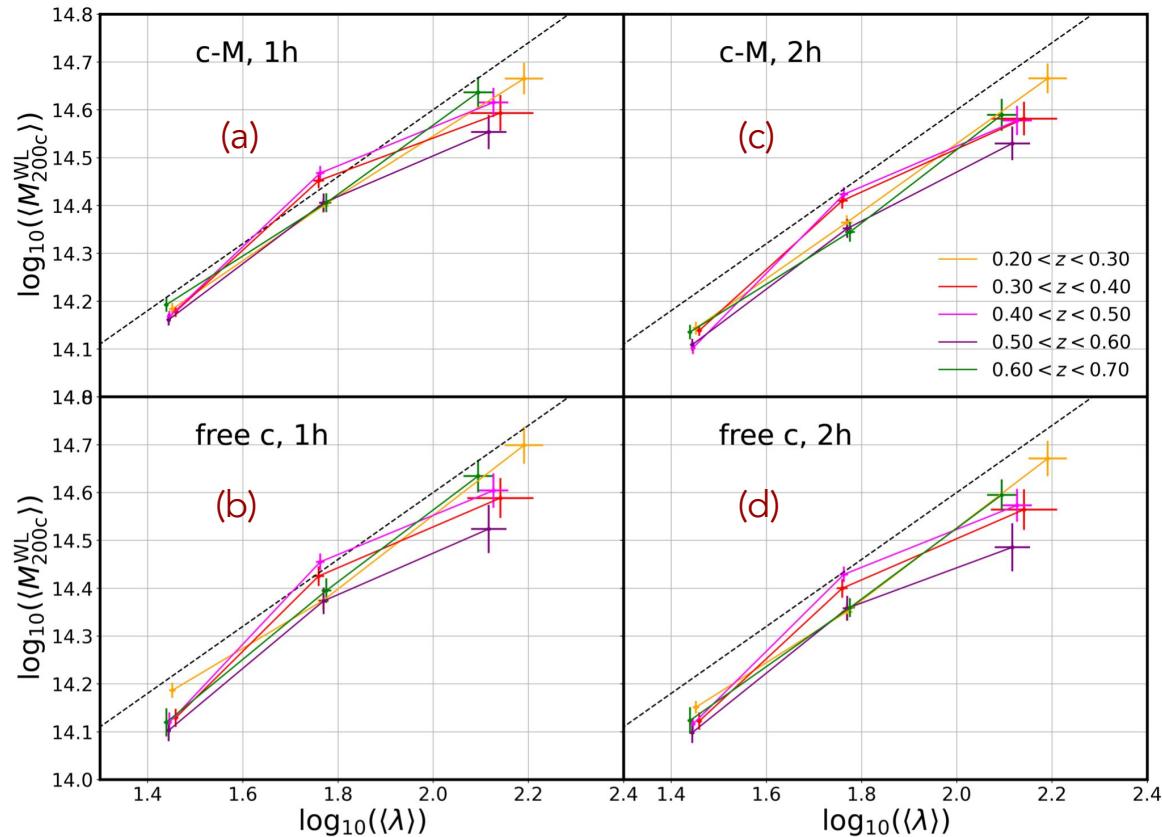


Binned mass-richness relation, in different richness-redshift bins

# WL mass-richness relation : Effect of modelling choices

1. Fit the cluster masses by considering de 4 modelling choices of the excess surface density
2. Constrain the mass-richness relation
3. Compare to "true" mass-richness relation

|        | 1h  | 1h + 2h |
|--------|-----|---------|
| c-M    | (a) | (c)     |
| free c | (b) | (d)     |

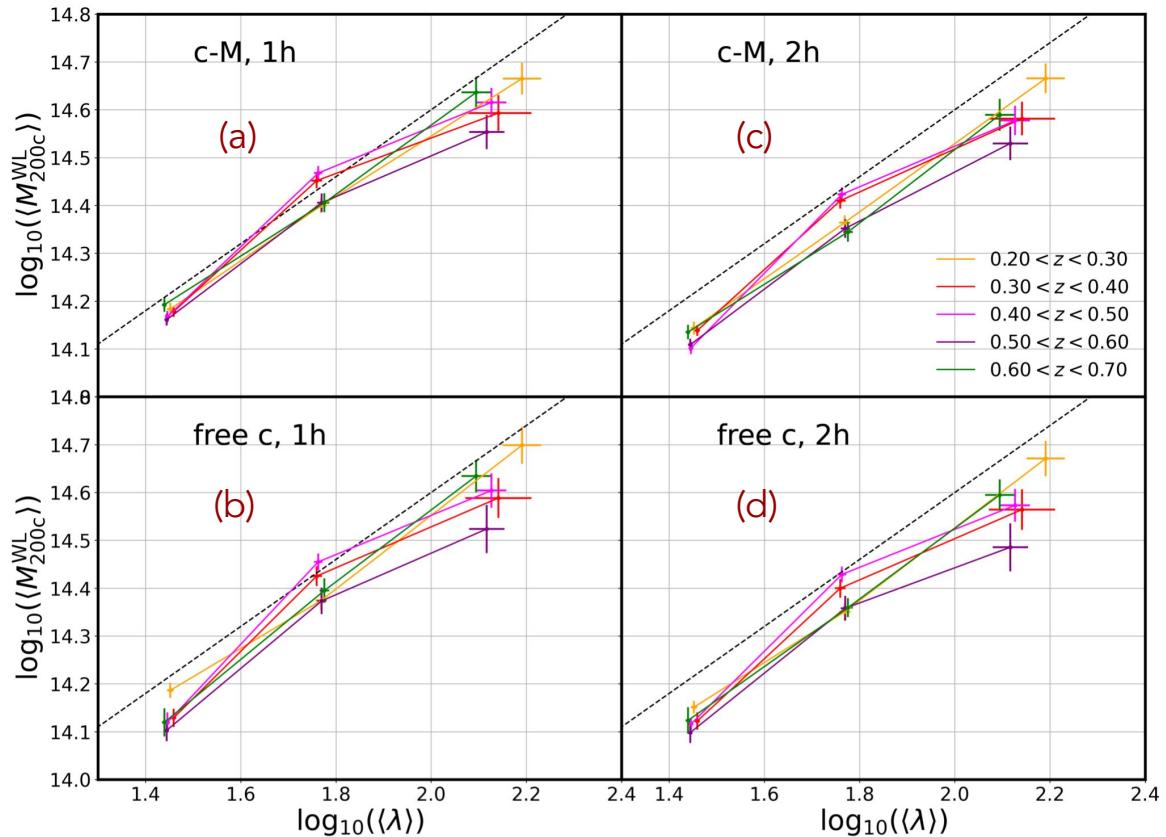
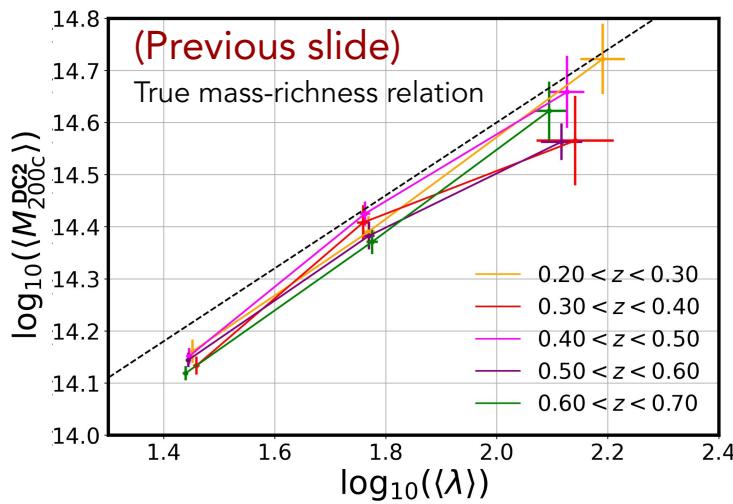


\*The arbitrary black line is in  
the same location in each plot

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| c-M    | (a) | (c)     |
| free c | (b) | (d)     |



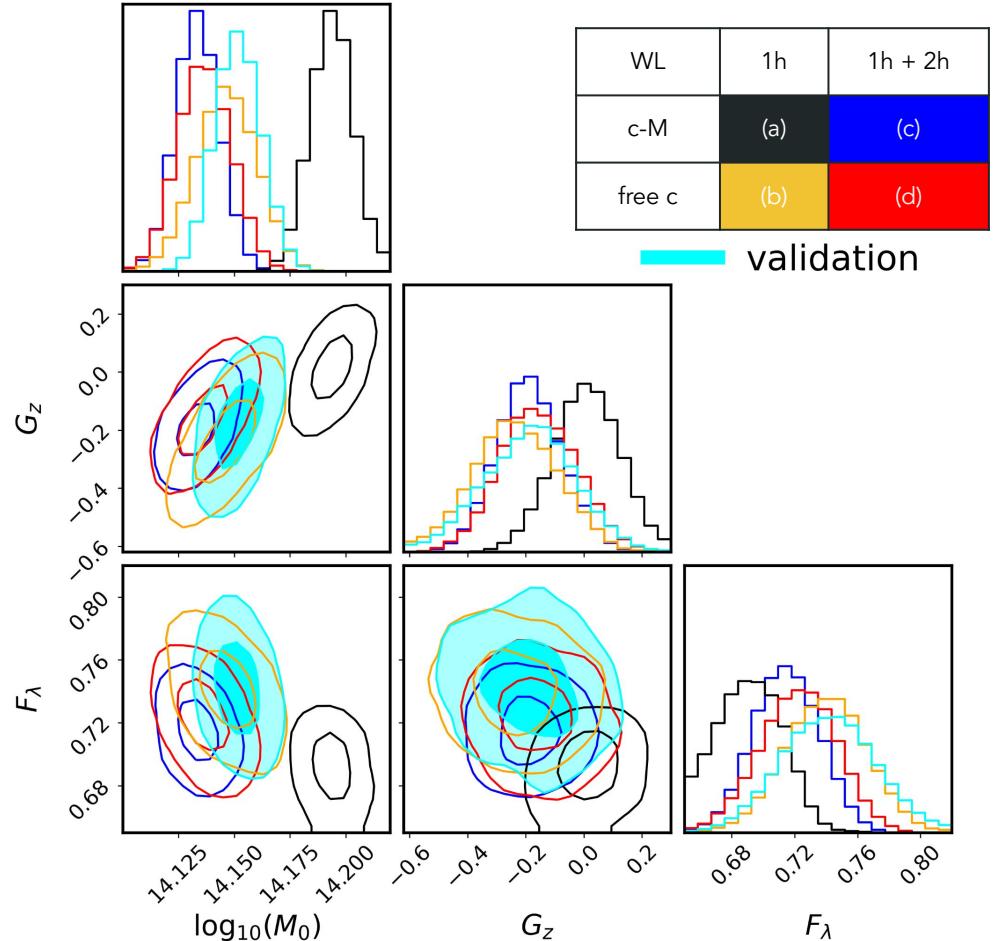
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# Results : Constraints on mass-richness relation

Constrain M- $\lambda$  the relation (McClintock et al., 2019)

$$\langle M_{200c} | \lambda, z \rangle = M_0 \left( \frac{\lambda}{\lambda_0} \right)^{F_\lambda} \left( \frac{1+z}{1+z_0} \right)^{G_z}$$

- Leaving free the concentration + 1-halo term (orange) gives most consistent results
- The use of 2-halo term (blue + red) gives 1-sigma compatible results, with slightly lower biased normalization
- Fixing the mass-concentration relation (black) gives more than 2-sigma tension with the normalization → needs to be repeated using c-M relation directly from the simulation.



# Conclusions

- The Data Challenge 2 supports the upcoming cosmological analysis with LSST. This work:
  - is part of the validation of the DC2 catalogs (Kovacs et al., 2021, arXiv:2110.03769),

## Validating Synthetic Galaxy Catalogs for Dark Energy Science in the LSST Era

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- Contributes to the development of DESC tools for galaxy cluster science.
- This work on DC2 seems to show that:
  - leaving free concentration + 1-halo term gives consistent results with “true” M- $\lambda$  relation,
  - the use of c-M relation may yield biased results will soon be checked with DC2 c-M relation
- In this work : ideal shapes, redshifts. Related studies :
  - Test the effect of photometric redshift of background galaxies,
  - more realistic galaxy catalogs are produced from the measured shapes of galaxies on Rubin-like processed images, and using LSST pipeline (so called DC2object catalog). Test the effect of the shape measurement on the WL mass-richness relation.

Perspective : include mass-richness relation in cluster abundance cosmological analysis.

Thank you for your attention !