

# Galaxy cluster mass estimate from weak lensing signal

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Abell 1689

Largest gravitationally bound structures in the universe:

Composition: 86% dark matter, 12% ICM (hot gas), 2% galaxies

# Galaxy Cluster Cosmology

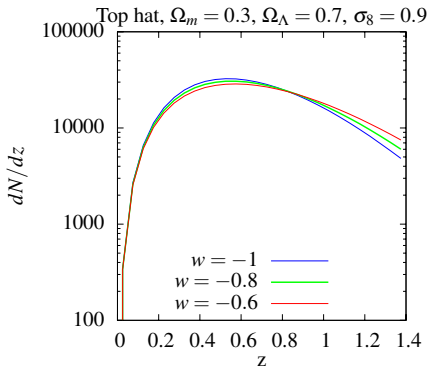
$$\text{Halo number density: } \frac{d^2 N}{dz d \ln M} = A_{\text{survey}} \frac{c}{H(z)} D_c^2(z) \frac{dn(M, z)}{d \ln M}$$

$$\text{Halo mass Function: } \frac{dn(M, z)}{d \ln M} = -\frac{\rho_m(z)}{M} f(\sigma_M, z) \frac{1}{\sigma_M} \frac{d\sigma_M}{d \ln M}$$

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# Uncertainty Sources

- Multiplicity function  $f(\sigma_M, z)$ : nonlinear regime of halo/cluster formation.  
N-body simulations: results depend on the halo mass definition.
  - Tinker et al. (2008): 5% precision at  $z = 0$ .
  - McClintock et al. (2018): 1% precision at  $z = 0$ .

The latter is required in the LSST era.

- Biased cosmological parameter estimators: cluster counts
  - Maximum likelihood estimators are not necessarily unbiased, even if they are consistent.
  - Study cases: maximum redshift, survey area, photometric and spectroscopic redshifts, mass uncertainty
  - Biases on  $\Omega_c$  and  $\sigma_8$  about 50% of the respective error bar, bias on  $w \sim 30\%$ :  $z_{max} = 1.1$ , spec-z and SZ-mass uncertainty,  $40,000\text{deg}^2$ .
  - Joint analyses (combined probes): unbiased estimators in all study cases. [M. Penna-Lima et al. JCAP 05 \(2014\) 039](#)

- $z^{\text{phot}} = z^{\text{true}} + z^{\text{bias}} \pm \sigma_z$ , where  $\sigma_z = \sigma_z^0(1 + z)$ ;

$$P(z^{\text{phot}}|z^{\text{true}}) = \sqrt{\frac{2}{\pi}} \frac{e^{-\frac{(z^{\text{phot}} - z^{\text{true}})^2}{2\sigma_z^2}}}{\sigma_z \left(1 - \text{erf}(z^{\text{true}}/\sqrt{2\sigma_z^2})\right)}$$

- Large surveys:

Dark Energy Survey (DES) – 5 filters, 5,000 deg<sup>2</sup>,  $\sigma_z^0 = 0.03$ ,  $z \lesssim 1.4$ ;

Javalambre Physics of the Accelerating Universe Astrophysical Survey (J-PAS) – 56 filters, 8,500 deg<sup>2</sup>,  $\sigma_z^0 = 0.003$ ,  $z \lesssim 1.0$ ;

Euclid Satellite – 7 filters,  $\sigma_z^0 = 0.025 - 0.053$ ,  $z \lesssim 2.0$ ;

Large Synoptic Survey Telescope (LSST) – 6 filters (ugrizy), 18,000 deg<sup>2</sup>,  $\sigma_z^0 \leq 0.02$ ,  $z^{\text{bias}} < 0.003$ ,  $z \lesssim 1.2$

# Uncertainty Sources - cluster mass

- Main source of uncertainties.
- Mass is not directly observed.

Determining the relationships between survey observables and halo mass represents the most difficult and complex challenge for cluster cosmology. LSST DESC Science Roadmap

- Mass proxies:
  - X-ray: total luminosity  $L_x$ , temperature  $T_x$ , thermal energy  $Y_x = M_{gas} T_x$
  - mm (Sunyaev-Zeldovich effect): Compton-y parameter  $Y_{SZ}$
  - Optical/IR: richness  $\lambda$ , weak lensing (WL) shear

Unbinned cluster count:

$$\frac{d^2 N(\lambda_i, z_i^{\text{phot}}, \vec{\theta})}{dz^{\text{phot}} d\lambda} = \int d \ln M \int d\lambda^{\text{true}} \int dz^{\text{true}} \Phi(M, z)$$
$$\times \frac{d^2 N(M, z^{\text{true}}, \vec{\theta})}{dz^{\text{true}} d \ln M} P(\lambda_i | \lambda^{\text{true}}) P(\lambda^{\text{true}} | \ln M) P(z_i^{\text{phot}} | z^{\text{true}})$$

- The mass proxy relations must be calibrated to within 5% level over the mass and redshift ranges in order to access the full constraining power of galaxy clusters. Hao, Rozo and Wechsler (2010), von der Linden et al. (2014)
- WL most promising - absolute mass (not sensitive to gas astrophysics).
- WL individual mass estimates incur smaller bias than X-ray, but they are noisy.
- Use multi-wavelength data to measure low-scatter mass proxies relations (e.g., X-ray) and their covariances identifying the optimal combination of follow-up observables to enhance LSST cluster science.



In general we can write

$$\ln(M_{\mathcal{O}}/M_0) = \ln(1 - b_{\mathcal{O}}) + A_{\mathcal{O}} \ln(M_{true}/M_0),$$

where  $\mathcal{O}$  refers to an observable (e.g., X-ray, SZ...),  $M_0$  is the pivot mass,  $b_{\mathcal{O}}$  and  $A_{\mathcal{O}}$  are the bias and slope, respectively.

- Cluster cosmology: self-calibration (mass calibration + cosmology)
- Multi-wavelength analyses

- The SZ relation is usually calibrated with WL measurements assuming  $A_{SZ} = A_{WL} = 1.0$  e  $b_{WL} = 0.0$

$$\frac{M_{SZ}}{M_{WL}} = 1 - b_{SZ}.$$

See, e.g., von der Linden et al. 2014, Hoekstra et al. 2015 and Simet et al. 2017.

- Previous analyses provided underestimated error bars of  $b_{SZ}$ .
- Mainly due to strong assumptions on the other parameters.

# Pseudo cluster counts

New method to calibrate the mass-observable relations (also self-calibration):

$$\mathcal{L} = \prod_i \frac{1}{N} \int_{-\infty}^{\infty} d \ln M_{True} n(M_{True}, z^i) P(M_{PL}^{(i)}, M_{CL}^{(i)} | M_{True}, \vec{\theta}),$$

where

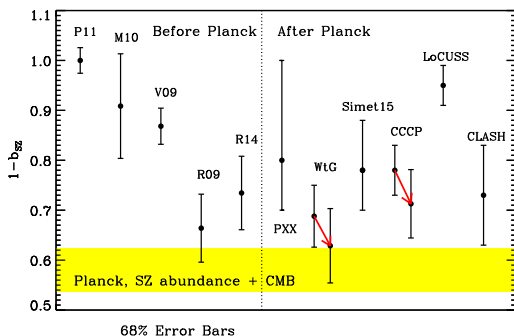
$$P(M_{PL}, M_{CL} | M_{True}, \vec{\theta}) = \int d \ln M_{SZ} d \ln M_L P(M_{PL} | M_{SZ}) \\ \times P(M_{CL} | M_L) P(\ln M_{SZ}, \ln M_L | M_{True}, \vec{\theta})$$

and

$$n(M_{True}, z) = f(M_{True}) \frac{dn(M_{True}, z)}{d \ln M_{True}} \frac{d^2 V}{dz d\Omega}.$$

M. Penna-Lima, J. Bartlett, E. Rozo, J-B Melin, et al., A&A 604, A89 (2017),  
arXiv:1608.05356

# Calibrating the *Planck* cluster mass scale with CLASH



- *Planck* and *Cluster Lensing And Supernova survey with Hubble* (CLASH): 21 clusters in common.
- We fit 11 parameters:  $A_{SZ}$ ,  $b_{SZ}$ ,  $\sigma_{SZ}$ ,  $A_L$ ,  $b_L$ ,  $\sigma_L$ ,  $\rho$ , selection function
- Reduced tension between CMB and clusters,  $1.34\sigma$ .

M. Penna-Lima, J. Bartlett, E. Rozo, J-B Melin, et al., *A&A* 604, A89 (2017),  
[arXiv:1608.05356](https://arxiv.org/abs/1608.05356)

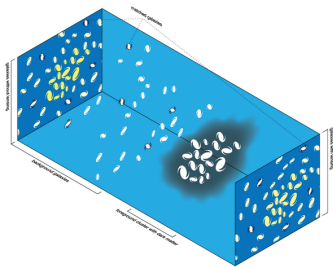
- Requirements (von der Linden et al. MNRAS 433 (2014) 3):
  - estimates of the distortion of each galaxy image due to the cluster (shear);
  - estimates of the redshifts of the galaxies used in the WL analysis (dependency on cosmological distances);
  - assumption about the mass distribution of the cluster (mass density profile).
- Individual cluster mass estimation: massive clusters -  $M \gtrsim 2 \times 10^{14} h^{-1} M_{\odot}$  (small fraction of the catalog).
- Mean cluster mass estimation: stack clusters in redshift and richness bins.

- Background galaxies are magnified and distorted by the gravitational potential of the cluster (lens).
- Measured quantity - reduced shear: the ellipticities of galaxies ( $e_1, e_2$ ) (bulge and disk) corrected for point spread function (PSF) effects. Tonegawa et al. (2018)
- Reduced shear (theory):

$$g = \frac{\beta_s(z_b)\gamma_\infty(R)}{1 - \beta_s(z_b)\kappa_\infty(R)},$$

$$\text{where } \beta_s = \frac{D_{LS}}{D_S} \frac{D_\infty}{D_{L,\infty}}.$$

By Michael Sachs



- Convergence  $\kappa(R)$  and tangential shear  $\gamma(R)$ :

$$\kappa(R) = \frac{\Sigma(R)}{\Sigma_c}, \quad \gamma(R) = \frac{\Delta\Sigma}{\Sigma_c} = \frac{\bar{\Sigma}(< R) - \Sigma(R)}{\Sigma_c},$$

where  $\Sigma_c = \frac{c^2}{4\pi G} \frac{D_S}{D_L D_{LS}}$ .

- Surface mass density:

$$\Sigma_\rho(R) = 2 \int_0^\infty \rho(R, z) dz$$

- Average surface density:

$$\bar{\Sigma}_\rho(< R) = \frac{2}{R^2} \int_0^R R' \Sigma_\rho(R') dR'$$

- Individual cluster mass estimation
- Mass estimates using the full photometric redshift posterior distributions of individual galaxies.
- Method used in the Weighing the Giants analyses. von der Linden et al. (2014), Applegate et al. (2014)
- They showed systematic biases in the mean mass of the sample can be controlled.
- In their analyses  $\Sigma(R) = \Sigma_{\rho}(R) = \int dz \rho(R, z)$
- $\rho$  is the matter density profile.
- Navarro-Frenk-White (1996) (NFW):  
$$\rho(r) = \frac{\delta_c \rho_{crit}}{(r/r_s)(1+r/r_s)^2}, \quad \delta_c = \frac{\Delta}{3} \frac{c^3}{\ln(1+c) - \frac{c}{1+c}},$$
 $c$  is the concentration parameter and  $r_s$  is the scale radius.

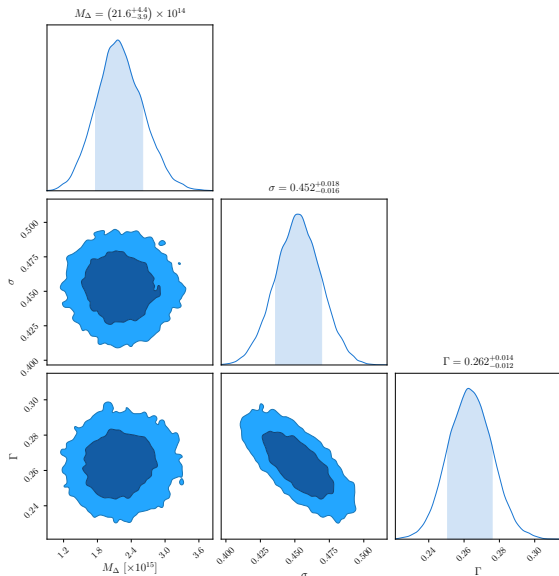


## Posterior

$$\mathcal{P}(M|\hat{g}) = P(M) \int_{\forall \alpha} P(\vec{\alpha}) \prod_i \int_z P(\hat{g}_i|g(z, M), \vec{\alpha}) P_i(z) dz d\vec{\alpha},$$

- $P(M)$ : prior on the cluster mass
- $P(\hat{g}_i|g(z, M), \vec{\alpha})$ : Voigt distribution (convolution of Gaussian and Lorentz distributions)
- $P_i(z)$ : redshift probability distribution of the i-th galaxy
- $\vec{\alpha}$ : Voigt profile and shear calibration parameters
- $g(z, M)$  ( $\hat{g}$ ): reduced shear (measured)

# Lensing masses with photo-z distributions



Effects to take into account to compute the surface mass density  $\Delta\Sigma$  (in addition to the cluster/halo profile term  $\Delta\Sigma_\rho(R)$ ):

- Miscentering: the observed systems may be incorrectly centered affecting the shear profile. Johnston et al. 2007
- 2-halo term  $\Delta\Sigma_{2h}$ : correction to the halo profile for larger scales than  $\approx$  the Virial radius (or  $R_\Delta$ ) due to the surrounding matter. Depends on the halo bias and the linear matter power spectrum.
- No-weak shear  $\Delta\Sigma_{nw}$ : massive clusters may not satisfy the weak lensing regime, i.e.,  $g_t \approx \gamma_t$ , if  $\gamma_t \ll 1$  and  $\kappa \ll 1$ .

- Central point mass associated to the BCG.  $\Delta\Sigma_{BCG}$

$$\Delta\Sigma = \frac{M_{BCG}}{\pi R^2} + p_{cc} [\Delta\Sigma_{\rho}(R) + \Delta\Sigma_{nw}(R)] \\ + (1 - p_{cc})\Delta\Sigma_{misc}(R) + \Delta\Sigma_{2h}(R),$$

where  $p_{cc}$  the fraction of miscentered clusters.

See, e.g., Parroni et al. (2017), Vitorelli et al. (2018), Pereira et al. (2018), Cibirka et al. (2017) and references therein.

- Implement other matter density profiles, e.g., Diemer & Kravtsov.

Independent implementation: Numerical Cosmology library (NumCosmo) Vitenti and Penna-Lima ascl:1408.013, github

# Conclusions and next steps

- Absolute cluster mass calibration - WL most promising
- Relative cluster mass calibration (LSST follow-up with X-ray data)
- Requirements to better constrain cosmological models
- Individual cluster mass estimates via WL: simulations and WtG
- Implemented in NumCosmo
- Include corrections to compute the surface mass density and, consequently, the reduced shear: miscentering, 2-halo term, ...
- Implement other matter density profiles: Diemer & Kravtsov, Einasto, ...
- Obtain cluster mass estimates: DC2 and real data
- Cluster mass - a “problem” to cosmology but an opportunity to astrophysics.