

# Assessing Log-normal Scaling Relation Model

Arya Farahi<sup>1</sup>

Collaborators: August Evrard, Ian McCarthy, Scott Kay, David Barnes  
Sarah Mulroy, Graham Smith, Alexis Finoguenov

University of Michigan - Ann Arbor

September 20, 2017

---

<sup>1</sup>aryaf@umich.edu, <https://afarahi.github.io/>

# Cluster Cosmology Challenge

## Goals:

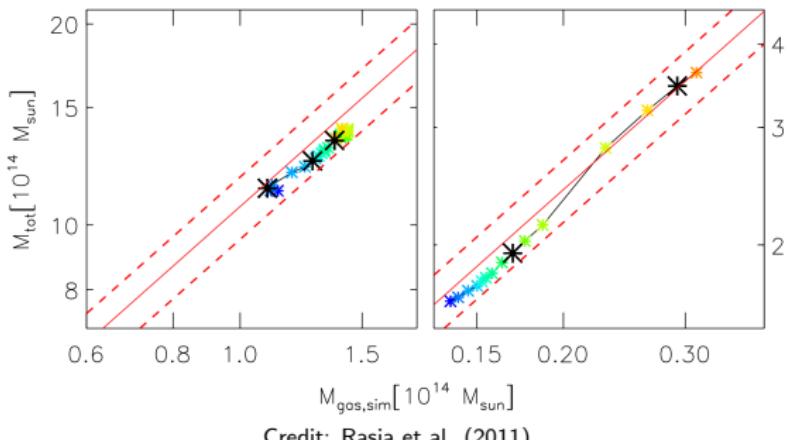
- Constrain Cosmological parameters
- Mass Calibration
- Astrophysics

## Key Messages:

- **Scaling parameters run with halo mass**
- **Log-normal is a sufficient model of halo properties**
- **Constraining the property covariance is achievable**

# Questions need to be answered

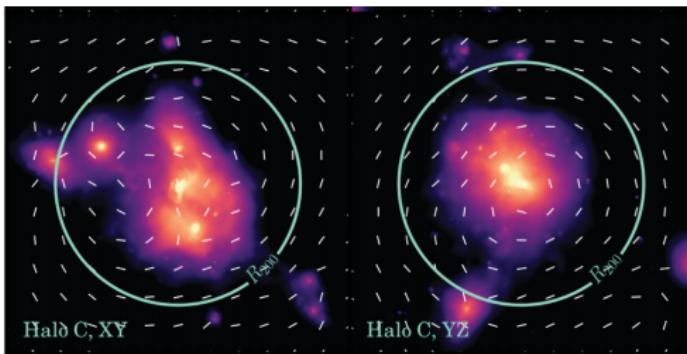
- Are our Mass-Observable relation Models accurate?
  - Is log-normal  $p(S|M, z)$  a good approximation?
  - Does the local slope and scatter/covariance run with mass and redshift?
- Test population model of Evrard et al. (2014) using sims
  - Can we achieve one percent prediction in expected mass?



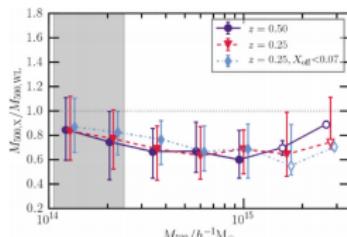
# BAHAMAS + MACSIS simulations

BAHAMAS [McCarthy et al. (2016)], MACSIS [Barnes et al. (2017)]

- SPH simulations with star formation, SN+AGN feedback
- BAHAMAS = 400[Mpc/h] box with  $2 \times 1024^3$  particles
- MACSIS = 390 resimulations of very high mass halos chosen from 3.2[Gpc] N-body sim
- Same hydro model parameters for both studies
- Sub-grid params tuned by stellar mass function and X-ray scaling relations
- Samples of 10,000 halos above  $10^{13.5} [M_\odot]$



Credit: Henson et al., (2017)



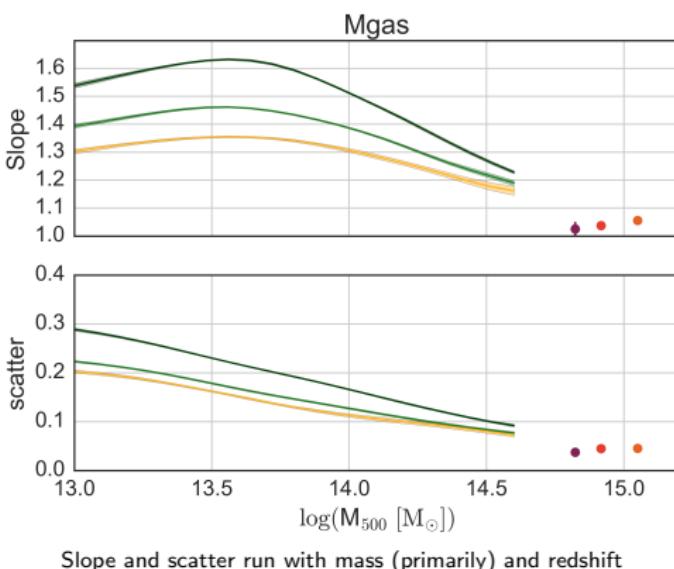
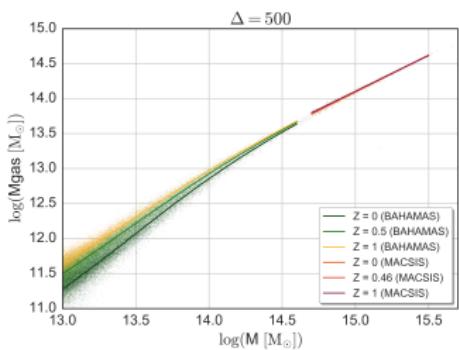
Credit: Henson et al., (2017)

**Above:** synthetic X-ray surface brightness (color) and shear field for 2 projections of a merging halo.

**Left:** X-ray to lensing mass ratio from analysis of synthetic images

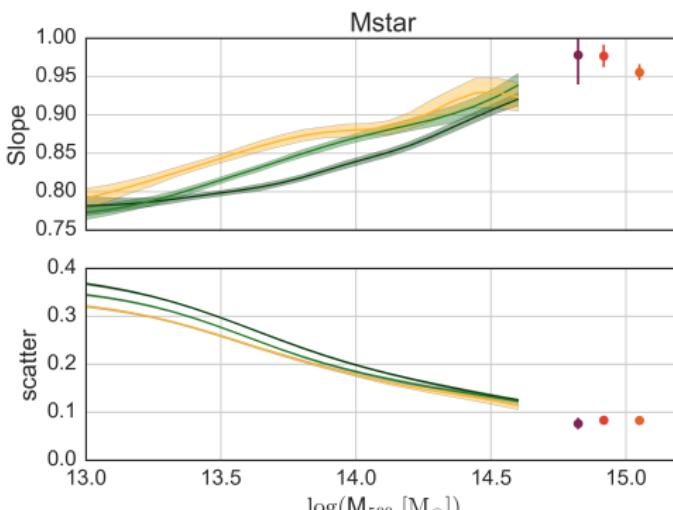
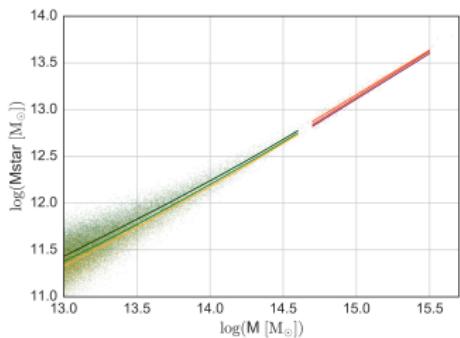
# Mass-Observable Relation (MOR) of halos: gas mass

- Focus on spherical  $M_{\text{gas}}$  and  $M_{\star}$  within  $\Delta = 2500, 500, 200$
- Locally linear regression (LLR) applied to BAHAMAS
- Simple LR on MACSIS



# Mass-Observable Relation (MOR) of halos: Stellar mass

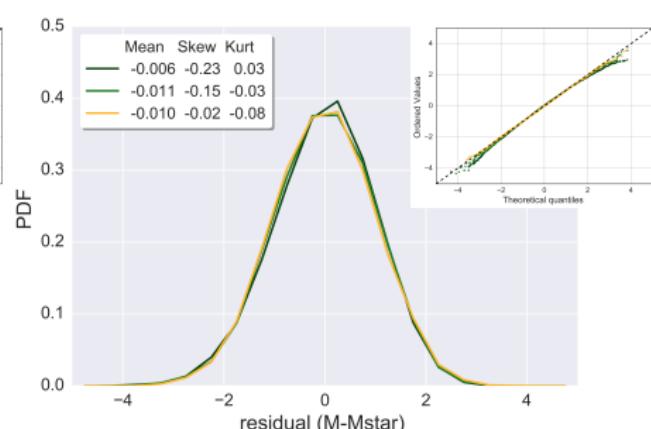
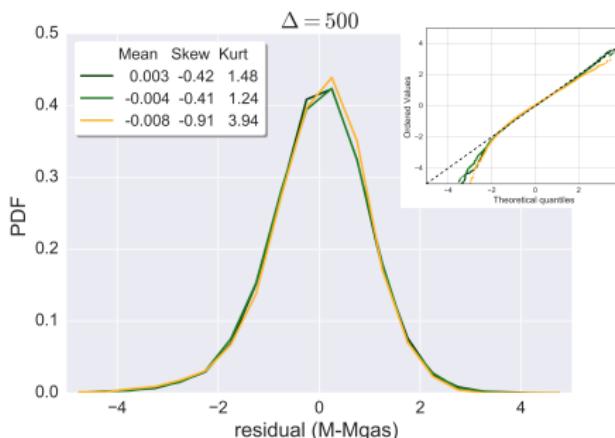
- Focus on spherical  $M_{\text{gas}}$  and  $M_{\star}$  within  $\Delta = 2500, 500, 200$
- Locally linear regression (LLR) applied to BAHAMAS
- Simple LR on MACSIS



Slope and scatter run with mass (primarily) and redshift

# Mass-Observable Relation (MOR) of halos: Stellar mass

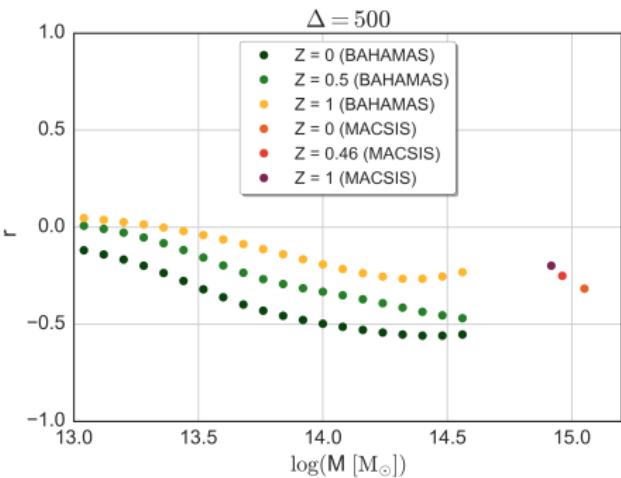
- **LOG-NORMAL** shape
- expected when multiple factors compete multiplicatively



PDF of residuals in gas and stellar mass about the local regression verifies the log-normal form. Residuals of  $M_{\text{gas}}$  (left panels) and  $M_{\star}$  (right panels) respect to the local fit.

# Mass-Property Relation (MPR) of halos: hot and cold baryon phase covariance

- Anti-correlation in higher mass halos
- deeper potential wells act more like closed baryon boxes



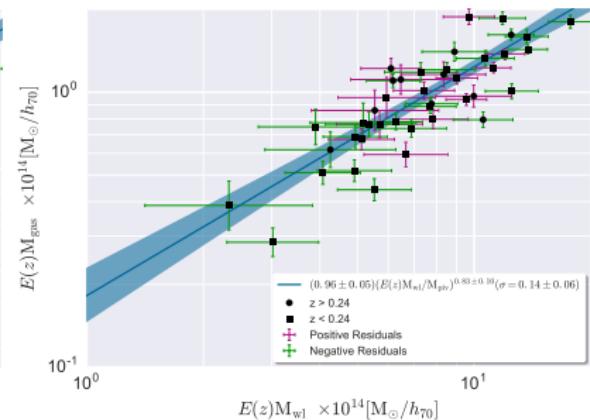
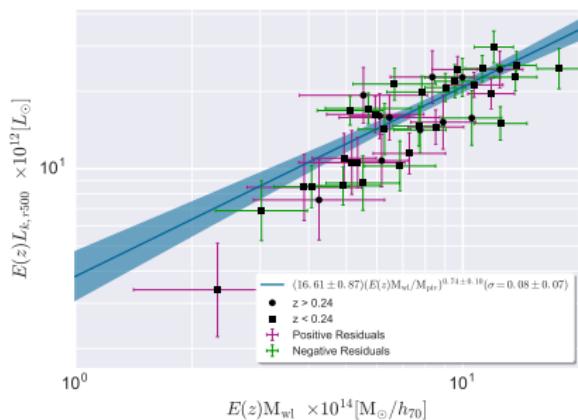
## Why it is important

- Constraining physics of clusters [e.g. Stanek et al. (2010), Wu et al. (2015)]
- It is an essential part of any Multi-wavelength cluster cosmology [e.g. Cunha et al. (2009)]

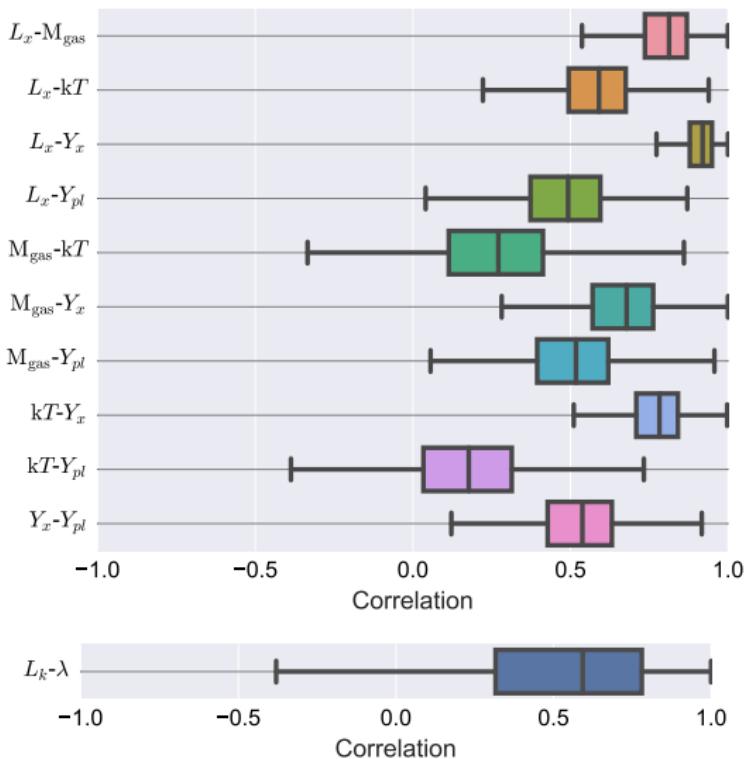
# The Local Cluster Substructure Survey [PI: G. Smith]

PRELIMINARY RESULT - Observational data provided by Sarah Mulroy

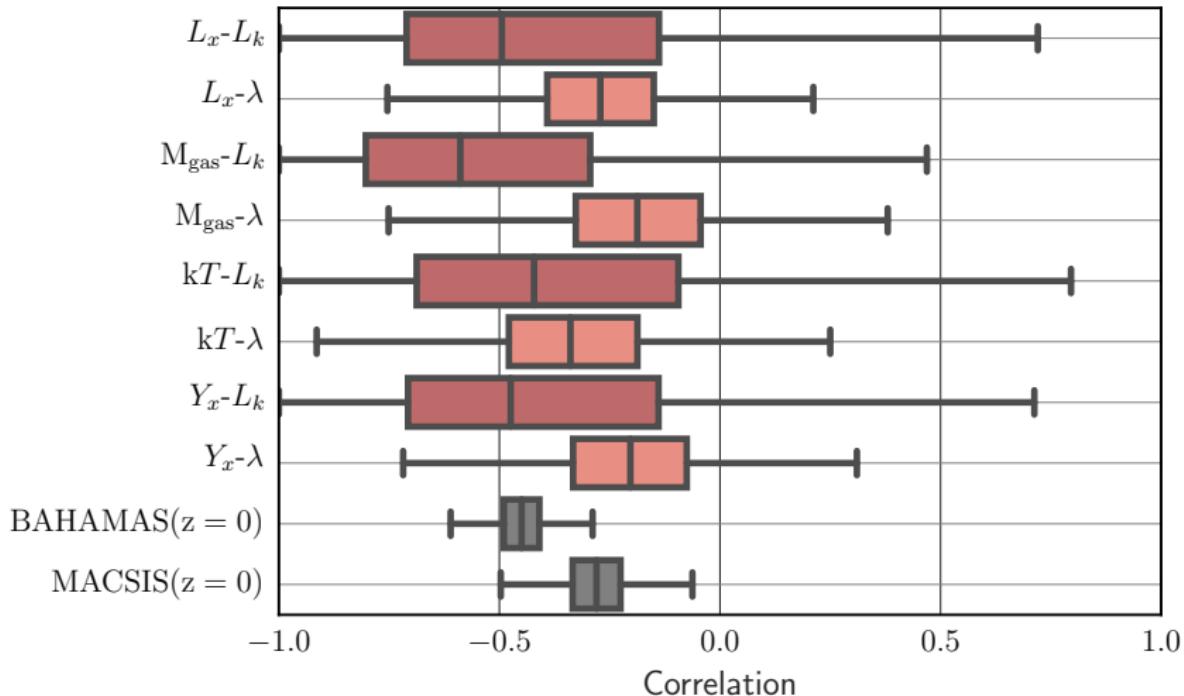
- multi-wavelength survey of galaxy clusters at  $0.15 < z < 0.35$ .
- selected from the ROSAT All-sky Survey catalogs (luminosity limited Sample)



# The property covariance for LoCuSS sample



# The property covariance for LoCuSS sample



# Analytical Model

$$\mathcal{L}_{full} = \mathcal{L}_{cosmology} \times \mathcal{L}_{scaling}$$

Typically the following relation is constrained observationally

$$\langle \ln M | \ln S \rangle = \pi + \alpha \ln S \text{ where } S = \lambda \text{ or } M_{gas} \text{ or } L_k, \dots$$

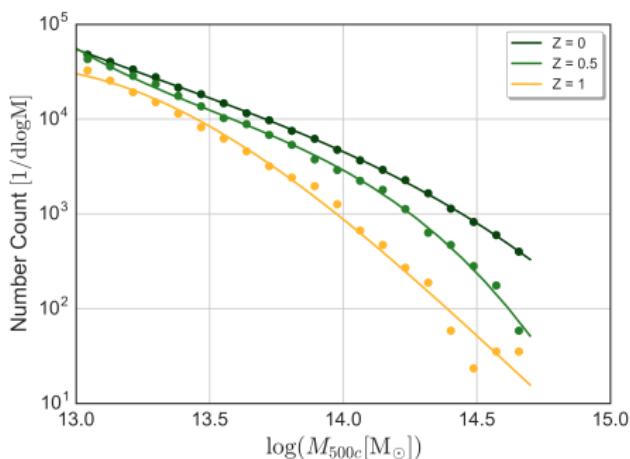
and the observable is  $N_{\Delta \ln(S), \Delta z}$

- In general  $\alpha$  can run with mass
- The Model assumes log-normal distribution

# A model for mass function

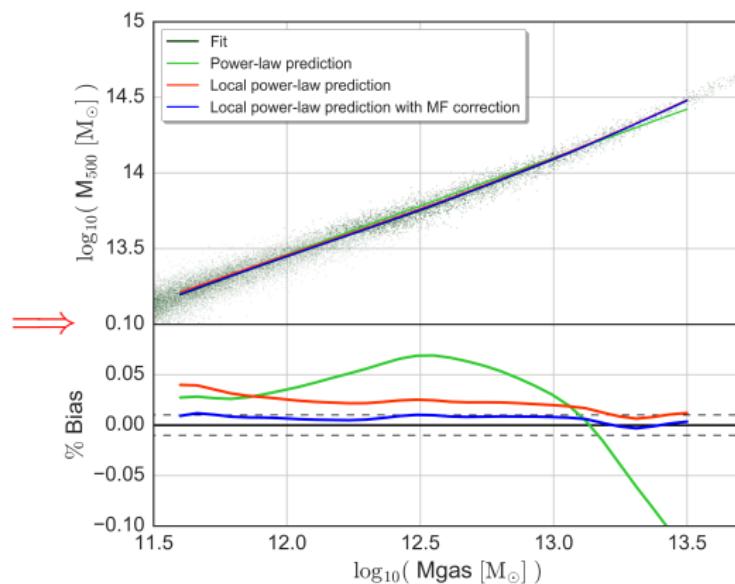
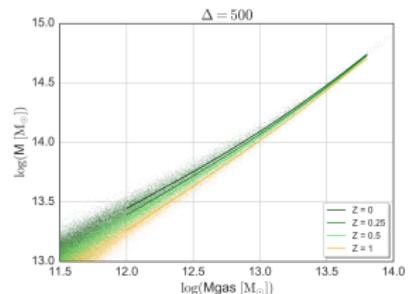
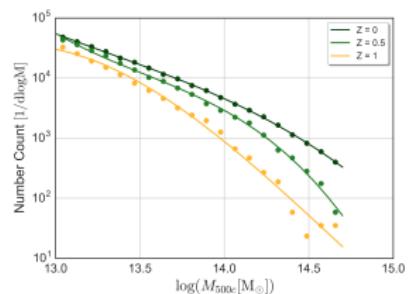
Because the form of the mass function,  $\frac{dn(\mu, z)}{d\mu}$ , as a function of  $\mu \equiv \ln(M/M_p)$  is smooth, according to Evrard et al (2014), one can use a polynomial expansion to fit the mass function. Here  $M_p$  is a free pivot mass with characteristic value of  $10^{14} M_\odot$ . We take a 3<sup>rd</sup>-order polynomial approximation to the mass function

$$\frac{dn(\mu, z)}{d\mu} = \exp [\beta_0 + \beta_1 \mu + \beta_2 \mu^2 + \beta_3 \mu^3]$$



Points = BAHAMAS counts as  
function of total mass  
Lines = fits using pivot mass of  
 $10^{14} M_\odot$

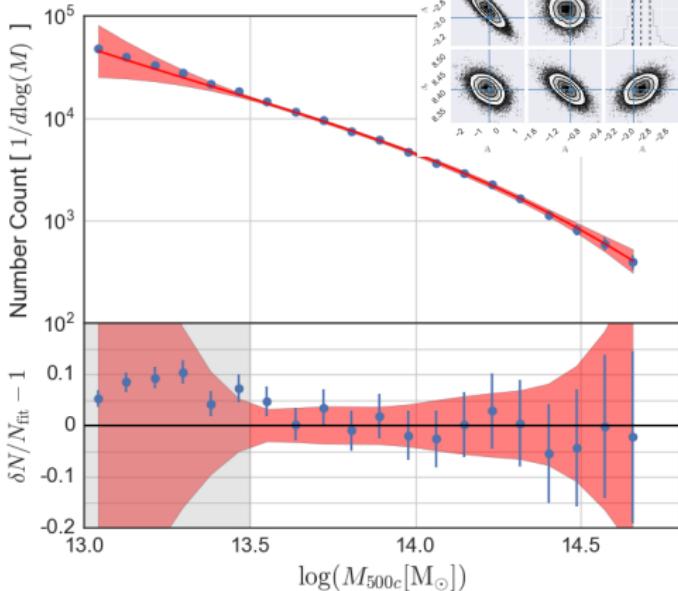
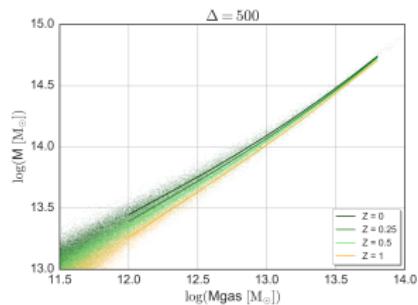
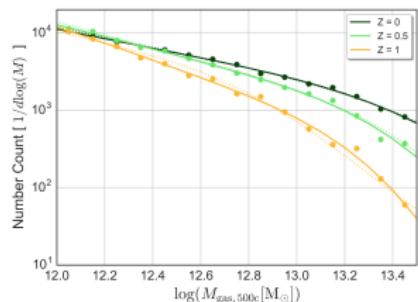
# Test #1: log-mean total mass at fixed $M_{\text{gas}}$



**Observables [Input]**

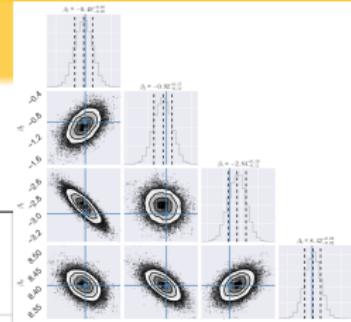
**Inferred  $\langle \log(M) \rangle$  [Output - only redshift zero]**

# Test #2: recovering MF shape parameters



Observables [Input]

Inferred MF [Output - only redshift zero]



# Conclusion

## Conclusion

- Scaling Parameters run with the halo mass
- Log-normal model is an adequate model to study Galaxy Clusters scaling relation
- The most massive clusters are well approximated by “close box” models
- Evrard et al. (2014) is a sufficient model to characterize the cluster population