

# Cluster and Protocluster Mass Estimation and Determination of their Dynamical States

Nick Battaglia  
Princeton  
GCF2017

**Mat Madhavacheril (Princeton),**  
Elinor Medesinski (Princeton), Cristobal Sifon (Princeton),  
Matt Hilton (UKZN), the ACT and HSC collaborations



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“Masses, what [are they] good for?”

-AM, Monday

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- Proper comparisons & classifications
- Cosmology
- Connection to theory/models
- Accurate & precise masses are hard

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“Boy, your talk is going to be boring”

-AM, Monday

# How do we measure/infer masses?

## Lessons learned from clusters

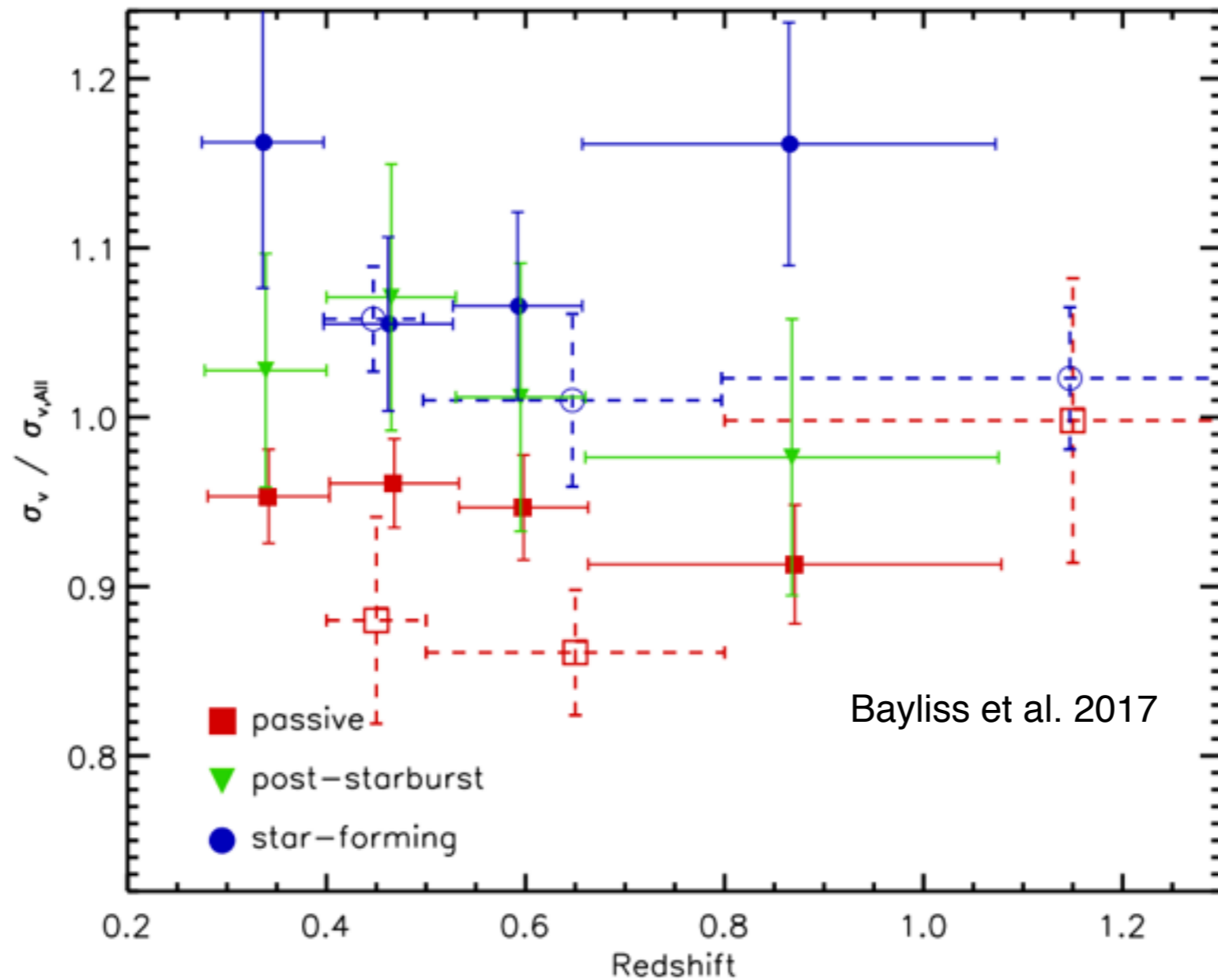
- Velocity dispersions
- X-rays:  $M_{\text{gas}}$ ,  $L_x$ ,  $T_x$ ,  $M_{\text{HSE}}$ ,
- Optical: Richness,  $M_{\text{star}}$ ,
- thermal SZ
- Weak lensing

# Lessons learned from clusters

Can we talk about velocity dispersions?

# Biases and systematics just on $\sigma$

## Color selection effects!

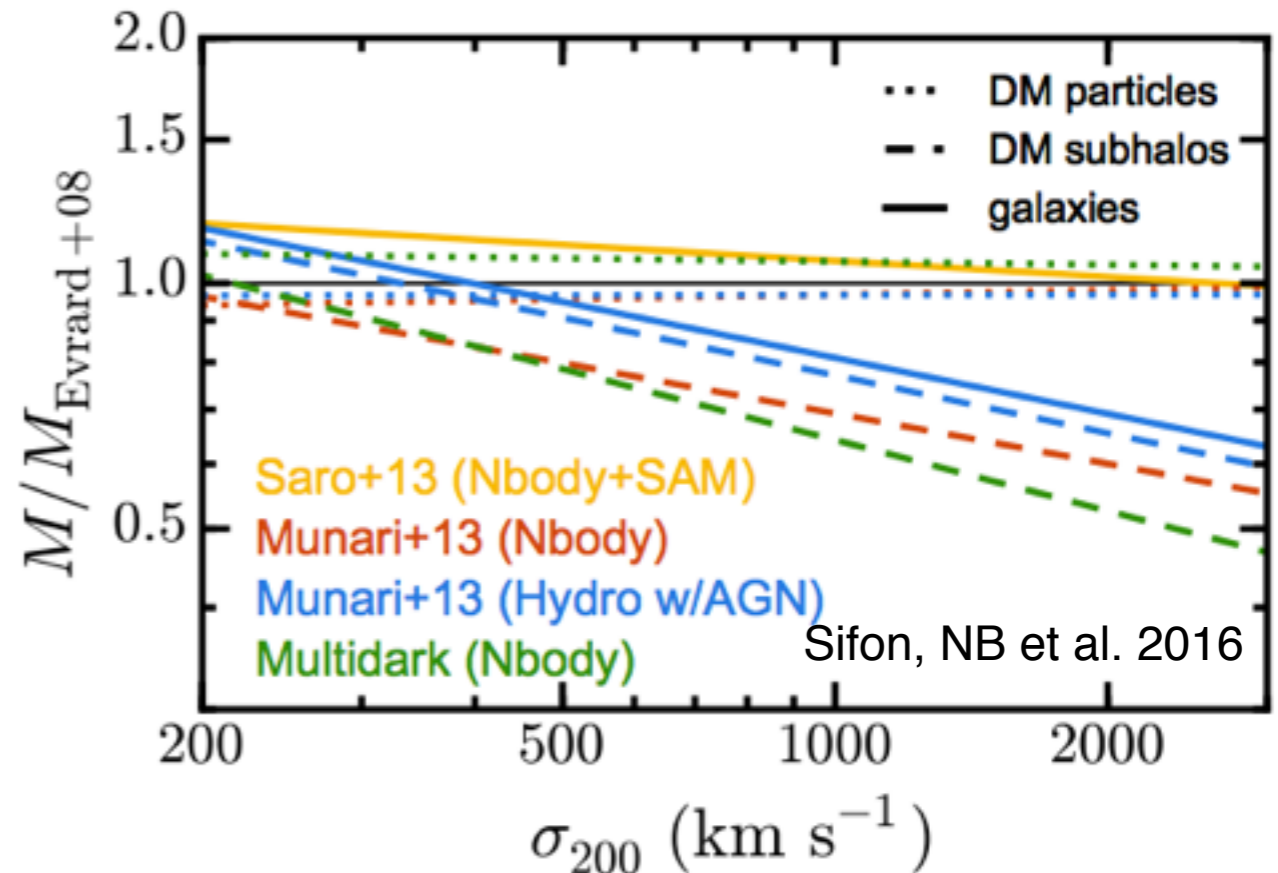
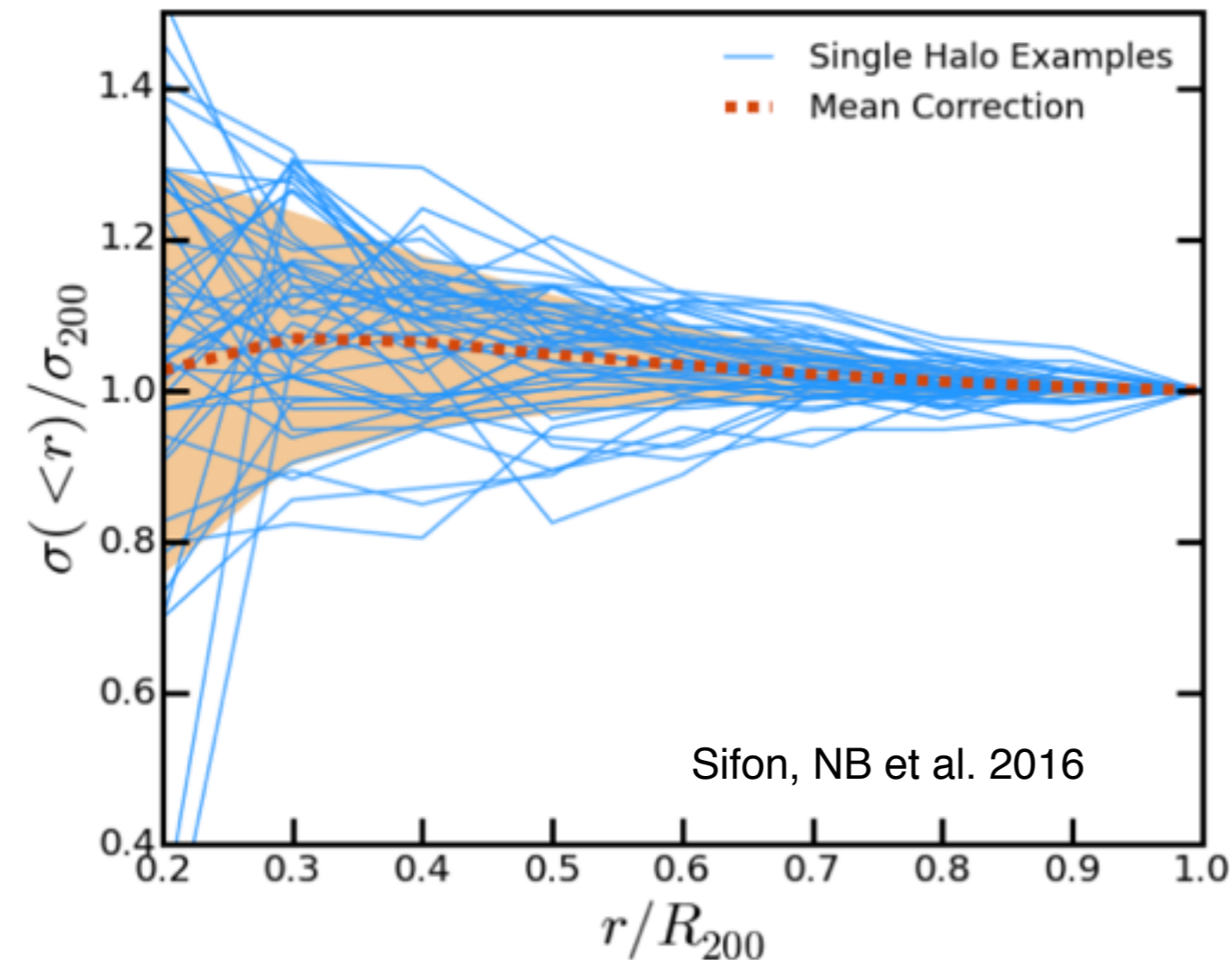


The selection of “tracers galaxies” of the potential matter



# More biases and systematics

## Radial selection effects



What  $\sigma$ -M relationship should one use?

Also intrinsic scatter, velocity bias, etc...

conservatively lead to  $\sim 30\%$  systematic uncertainty

Talking about “Relaxed” systems at low- $z$ !

“But what about the SZ?”

-Tony, Tuesday

# Thermal Sunyaev-Zel'dovich Effect

Compton-y parameter

$$\frac{\Delta T}{T_{CMB}} = g_v y$$

Integrated pressure

$$y = \frac{k_b \sigma_T}{m_e c^2} \int n_e T_e dl$$

tSZ properties

-Total thermal energy

$$Y \sim \int y dA \propto T_{vir} M_{vir}$$

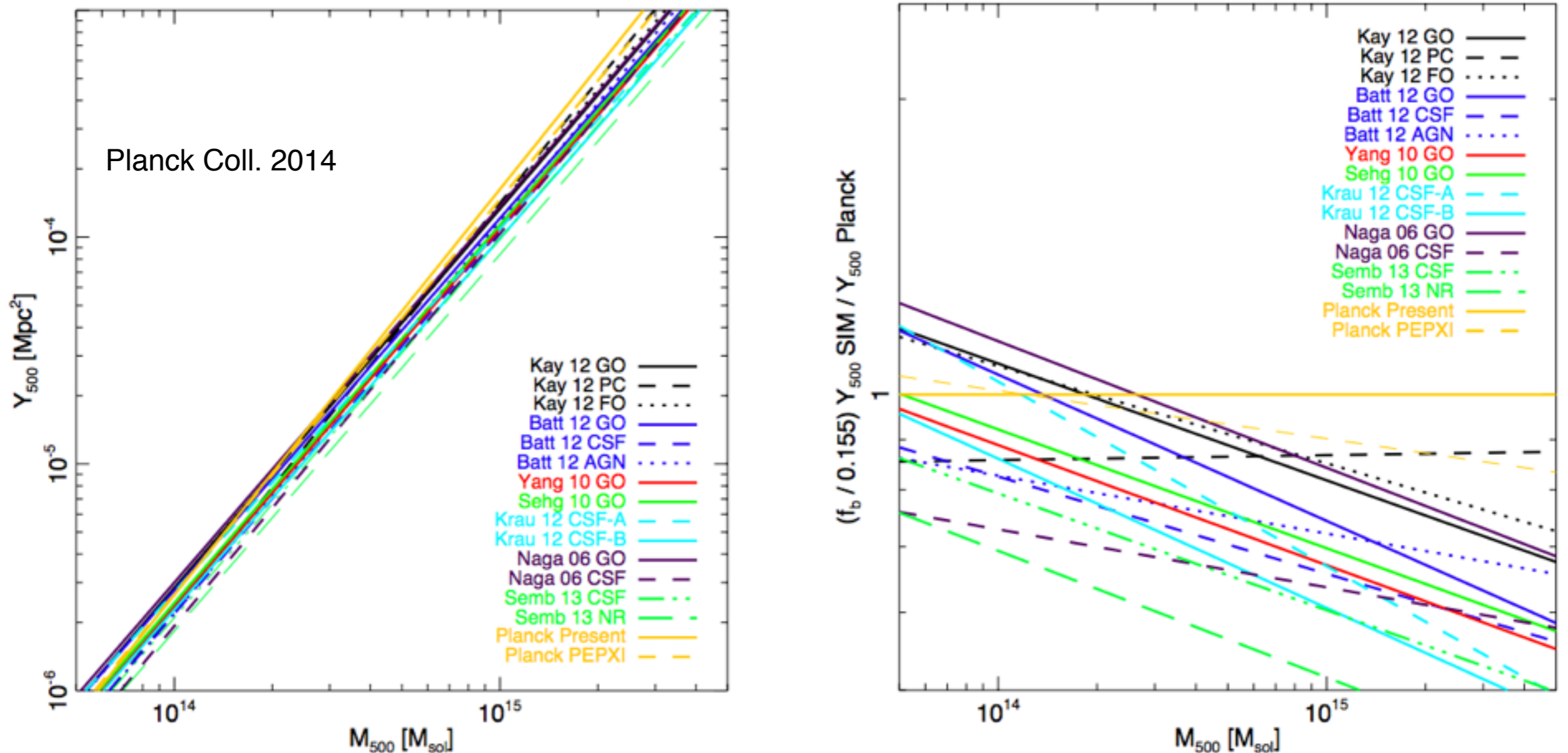
$$T_{vir} \propto M_{vir} / R_{vir}$$

$$Y \propto M_{vir}^{5/3}$$

-Most massive halos

-Redshift independent

# The many SZ scaling relations



What relations should one use?

Systematic error/bias in ones masses

Similarly for X-ray and Optical relations (too many references)

For SZ mass proxies

Calibrate!

Same for X-rays

Calibrate!

Same for richness

Calibrate!

For SZ mass proxies

Calibrate!

Same for X-rays

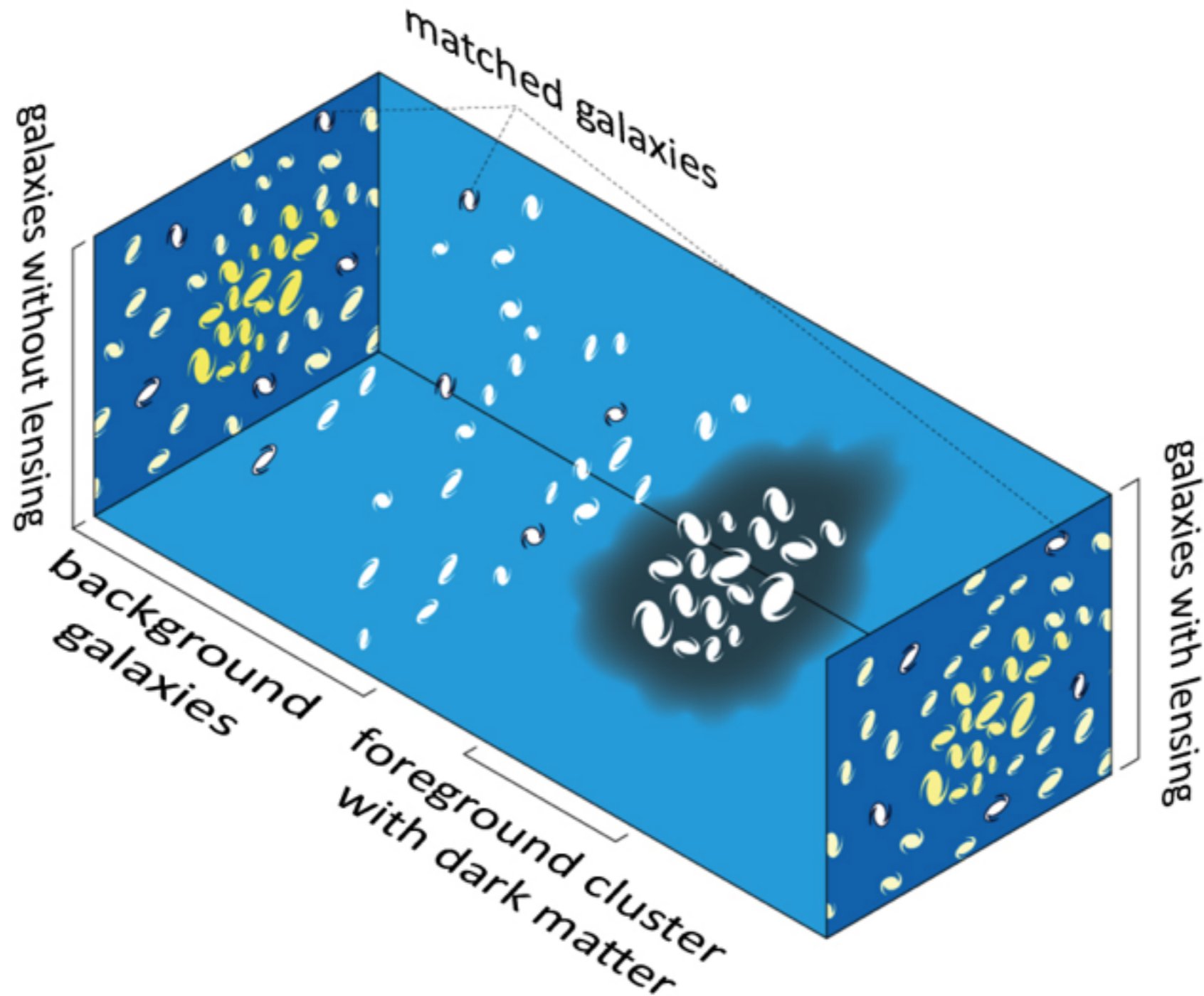
Calibrate!

Same for richness

Calibrate!

with weak-lensing measurements

# Weak Gravitational Lensing

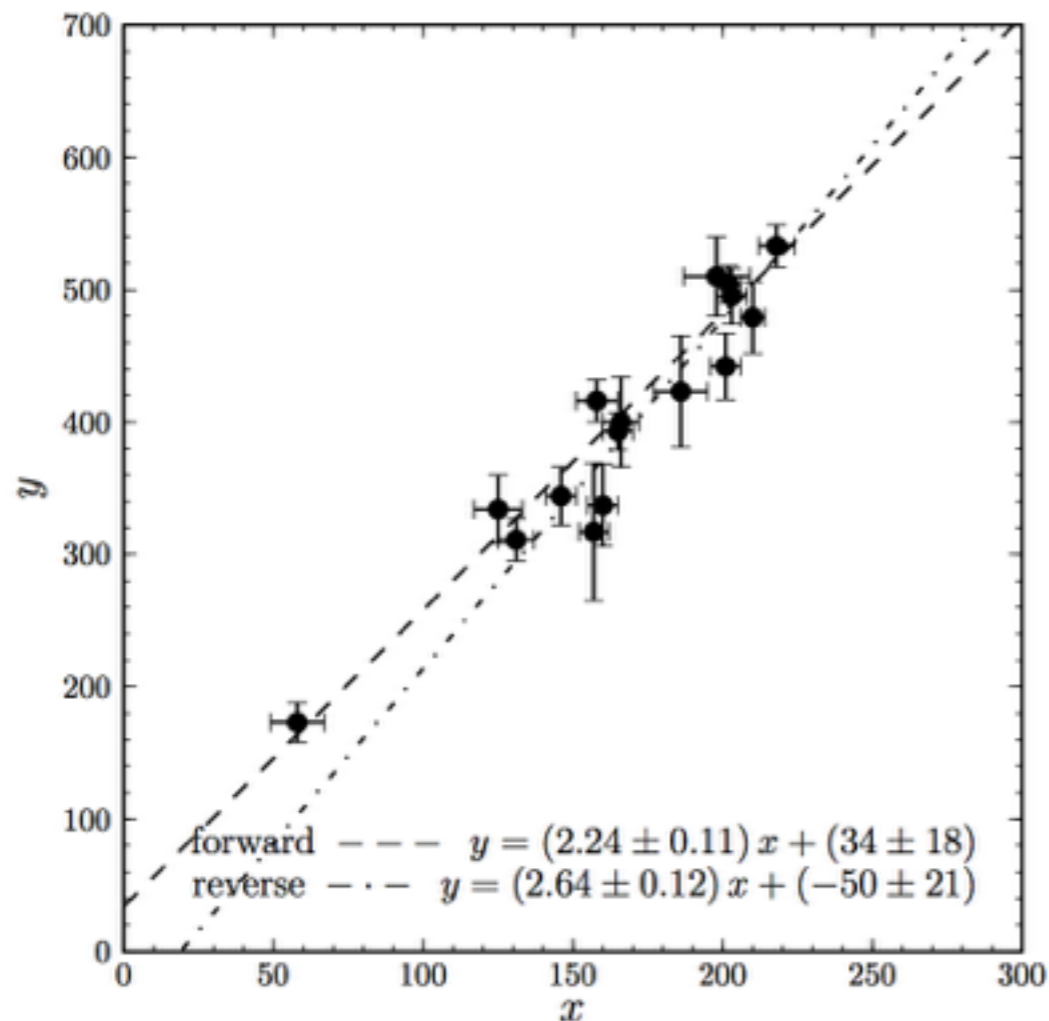


A coherent distortion of source galaxy apparent shapes  
Galaxy clusters produce a tangential distortion of the shear field  
- Infer total mass within given aperture

# Careful calculations of scaling relations matter

Please do not “git clone” any linear regression model fitting software, since they are almost never applicable to your data set!

Example from Hogg et al. 2010



“Forward and Reverse” fitting  
Comment in their caption -  
Don't ever do this



# Careful calculations of scaling relations matter

Selection function

Mass function

Errors on x & y variables



Eddington bias

Malmquist bias

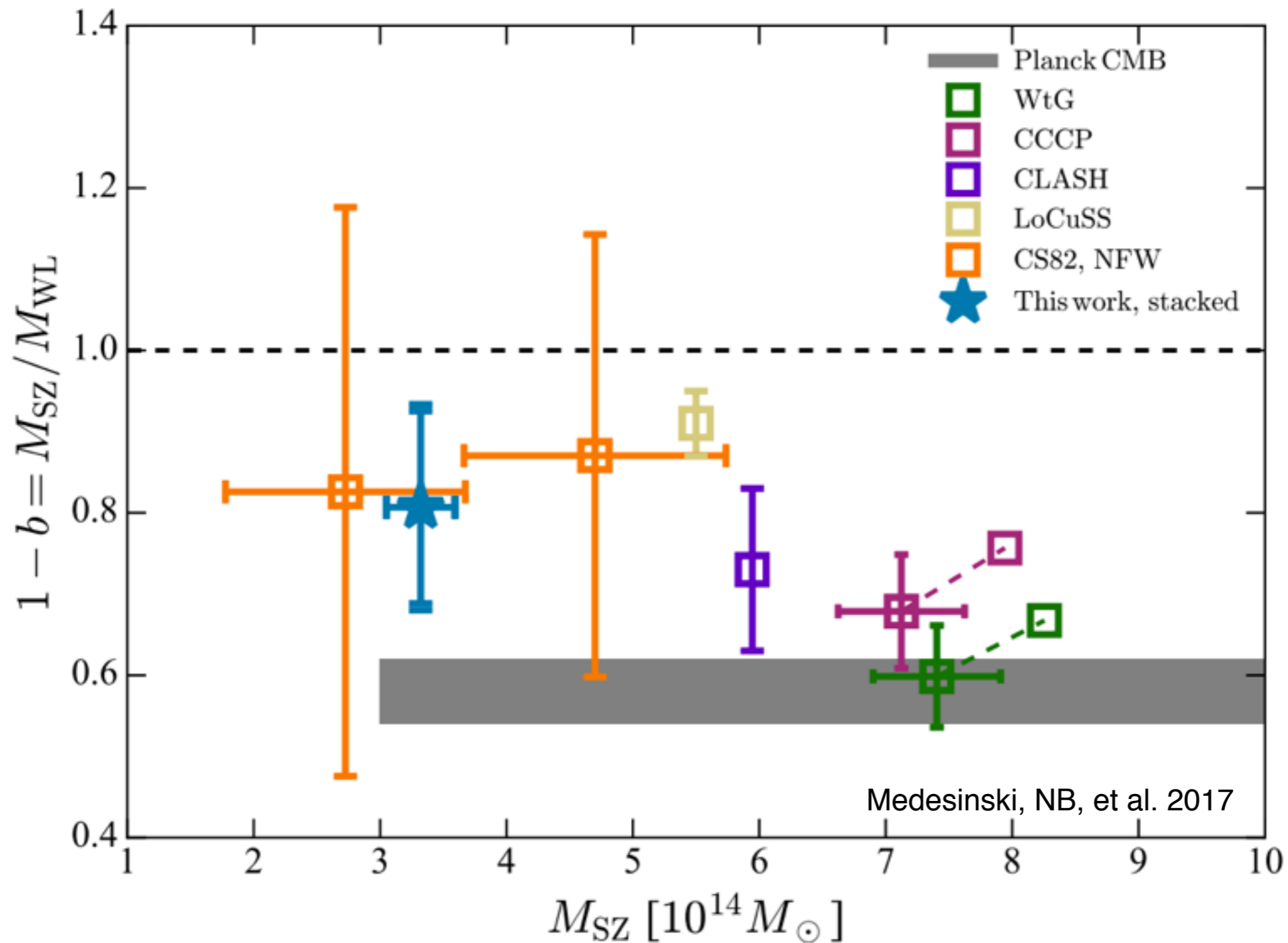
Intrinsic scatter

Intrinsic correlations

If one takes a Bayesian approach then a full maximum likelihood treatment is necessary

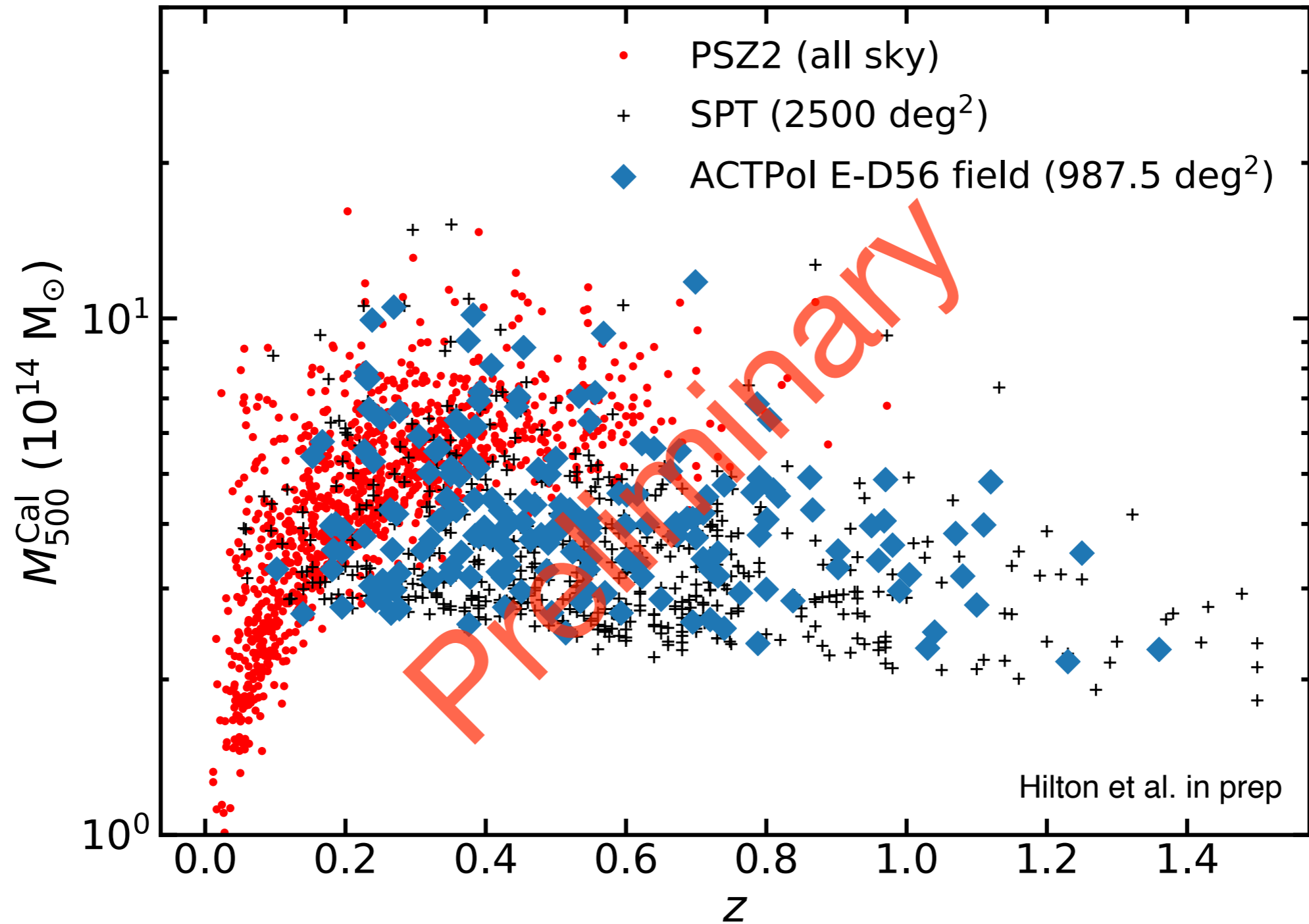
e.g., Kelly (2007), Evrard et al. (2014), Rozo et al. (2014),  
Munari & Ettori (2015), Sifon, NB et al. 2016, ...

# SZ mass calibration



Note  $M_{\text{SZ}}$  from SPT not a fair comparison

# SZ cluster detection

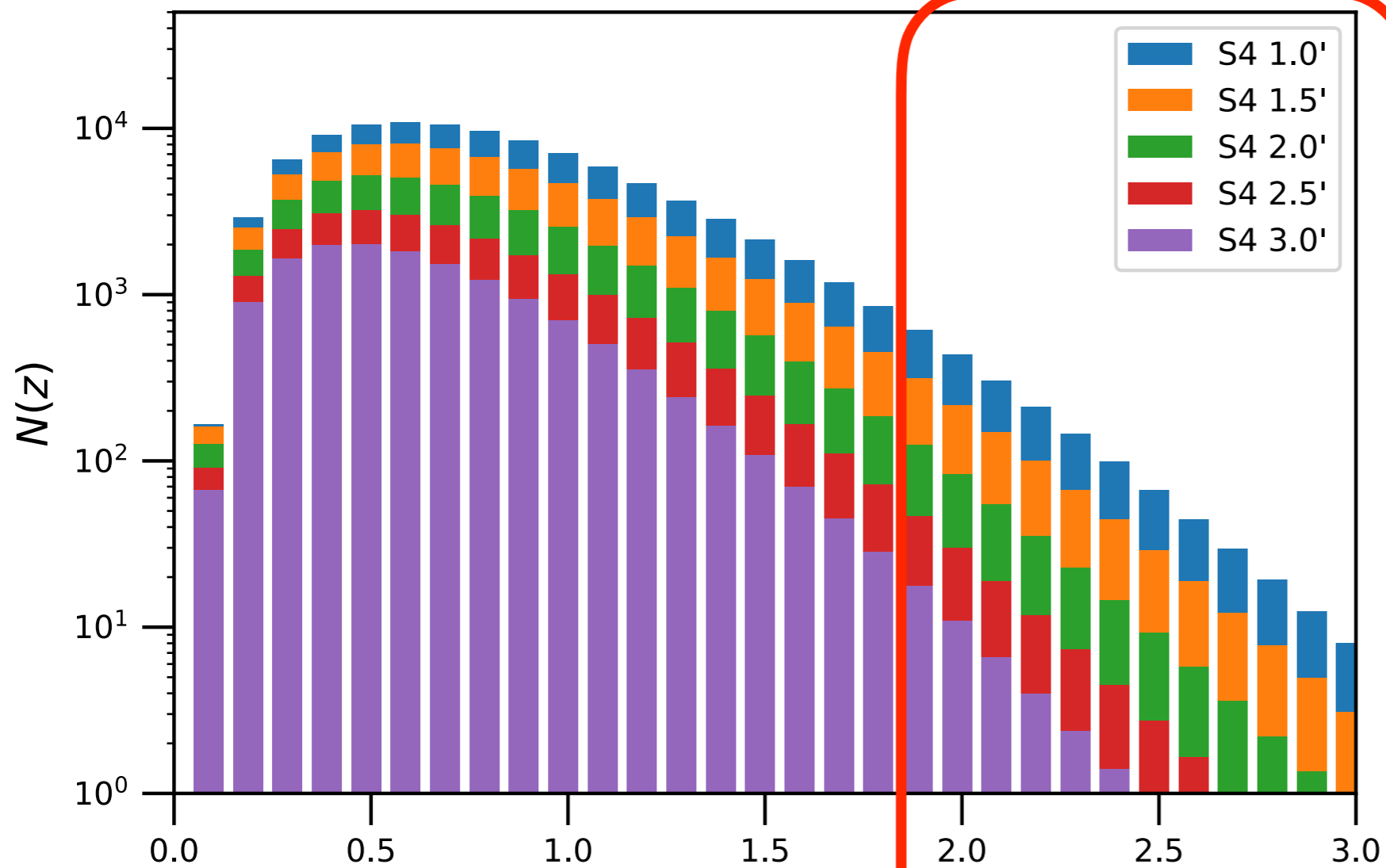


Note we have rescaled ACT to compare with SPT



- CMB-S4: a next generation ground-based program building on CMB stage 2 & 3 projects to pursue inflation, neutrino properties, dark energy and new discoveries.
- Targeting to deploy  $O(500,000)$  detectors spanning 30 - 300 GHz using multiple telescopes and sites to map most of the sky to provide sensitivity to cross critical science thresholds.
- Multi-agency effort (DOE & NSF). Complementary with balloon and space-based instruments.
- Broad participation of the US CMB community, including the existing NSF CMB groups, DOE National Labs and the High Energy Physics community

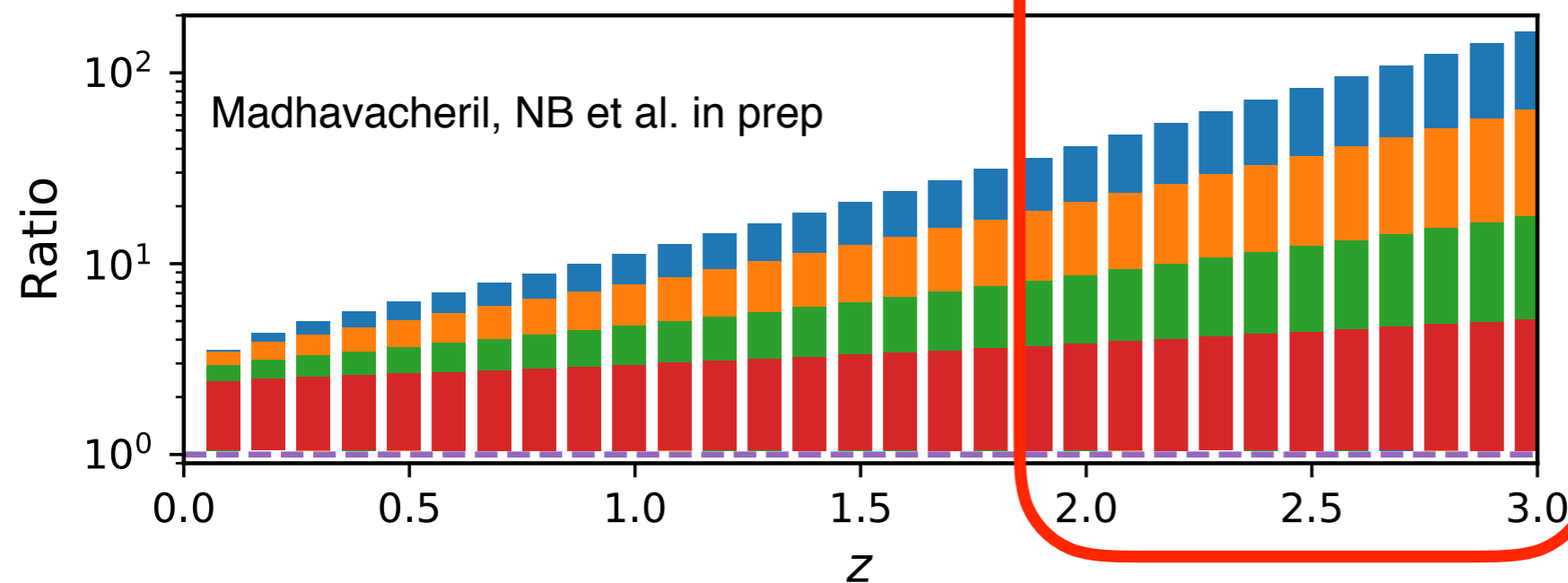
# Number of clusters “detected”



## Summary

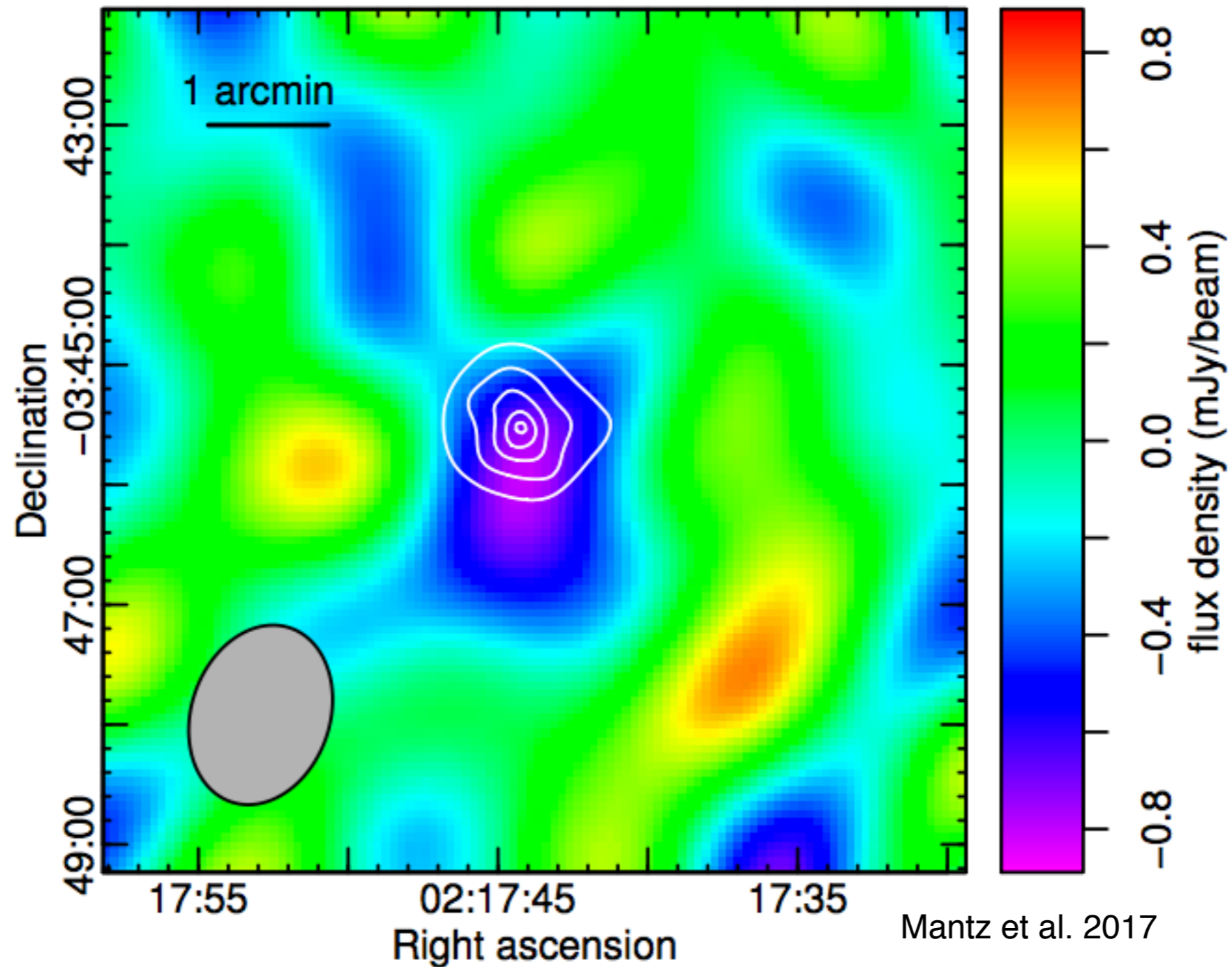
	2.0'	1.5'	1.0'
Total	43800	76800	122800
$z > 1.5$	1420	3640	7850
$z > 2.0$	180	560	1390

Discovery space



*Caveat*  
 assuming that  
 Y-M scaling  
 calibrated at  $z \sim 0$   
 + self-sim evolution

# Hot gas at $z = 2$ !

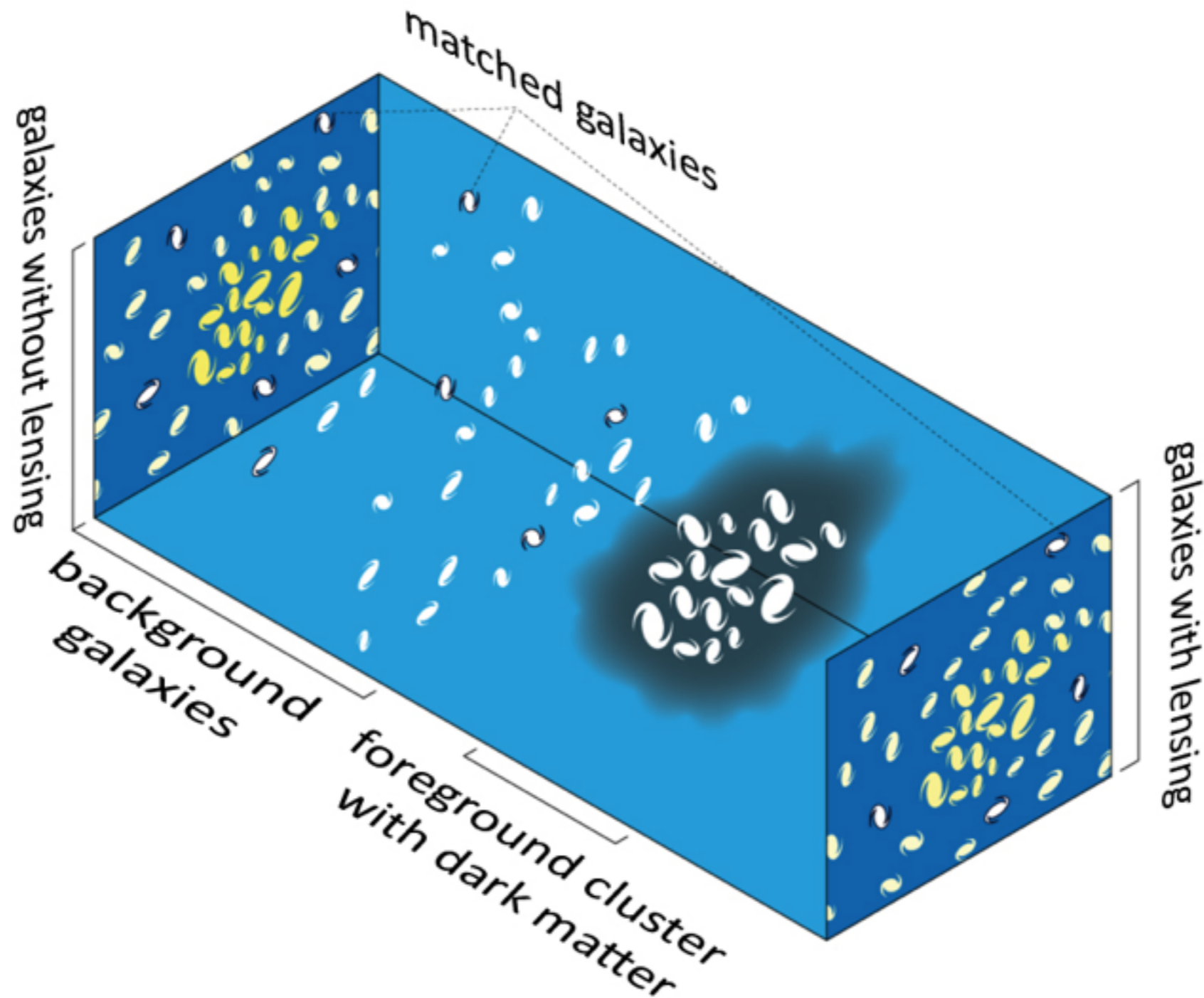


CMB-S4 will find all objects like this in the southern sky and more

“Yawn, you still haven’t told me how to accurately and precisely measure masses at high redshifts”

-AM, currently

# Weak Gravitational Lensing at high- $z$

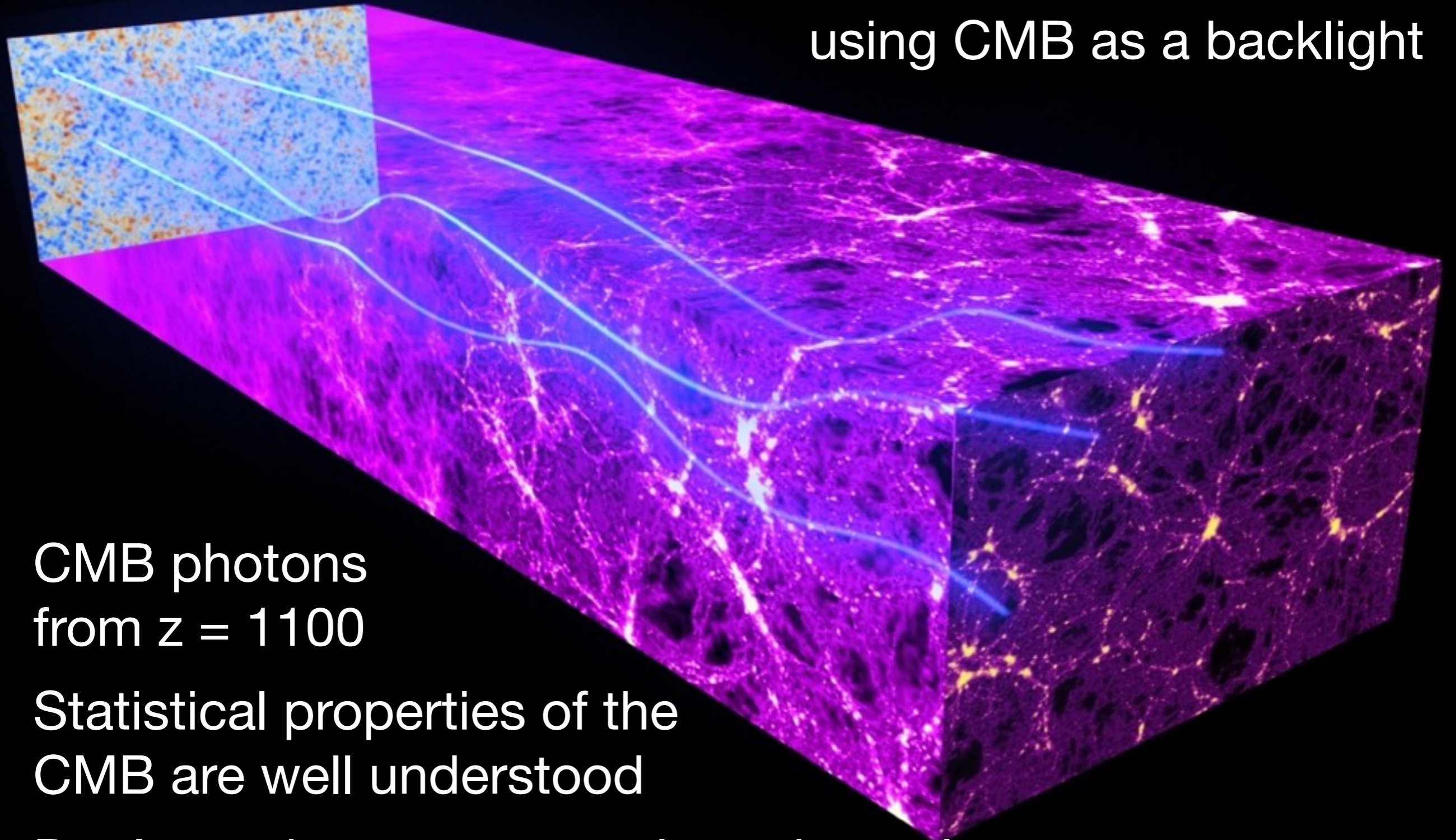


Becomes really difficult beyond  $z > 1.2$ , even for LSST, Euclid  
Lack of background galaxies, measuring shapes, photo-zs



# CMB lensing

using CMB as a backlight



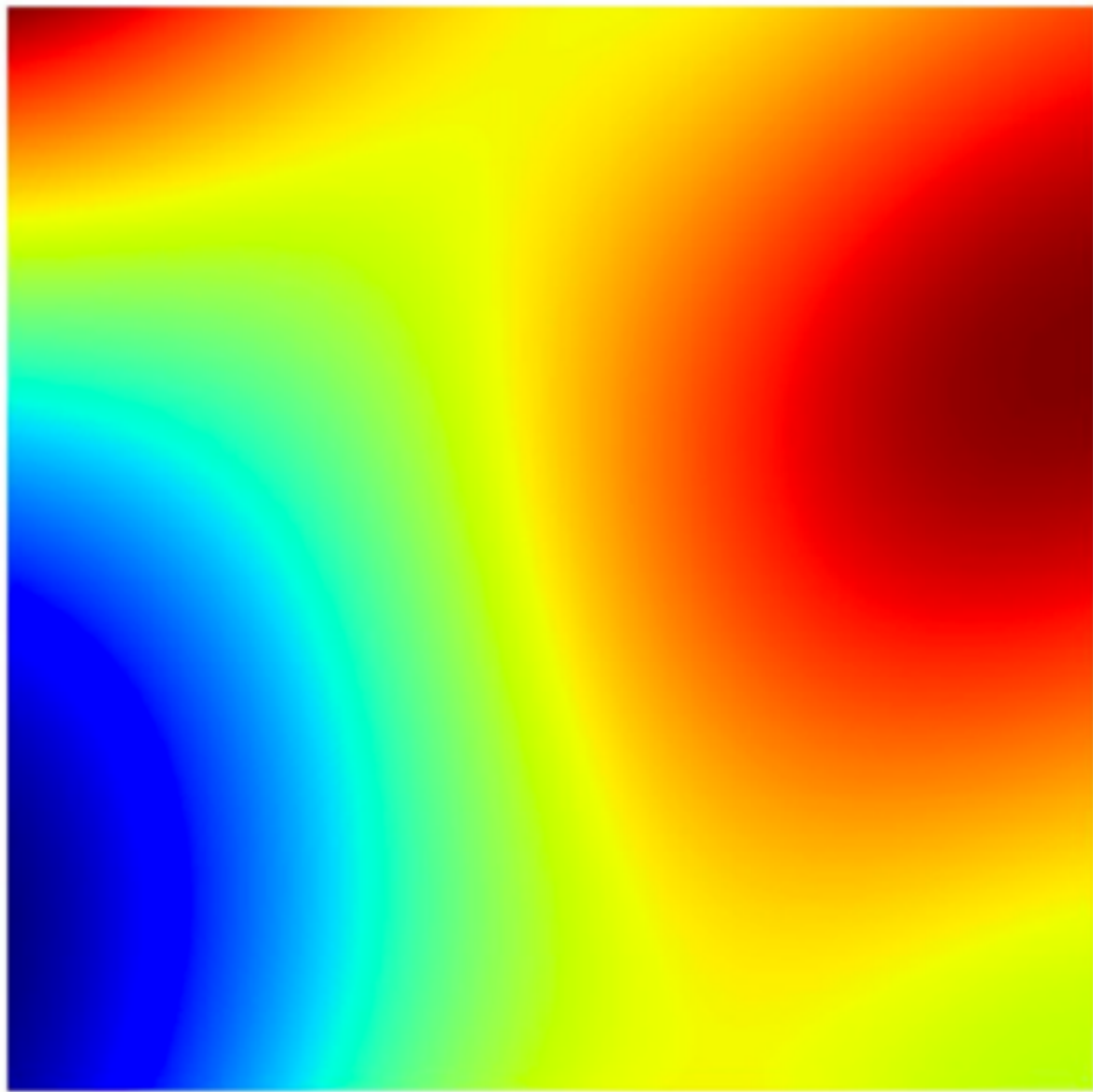
CMB photons  
from  $z = 1100$

Statistical properties of the  
CMB are well understood

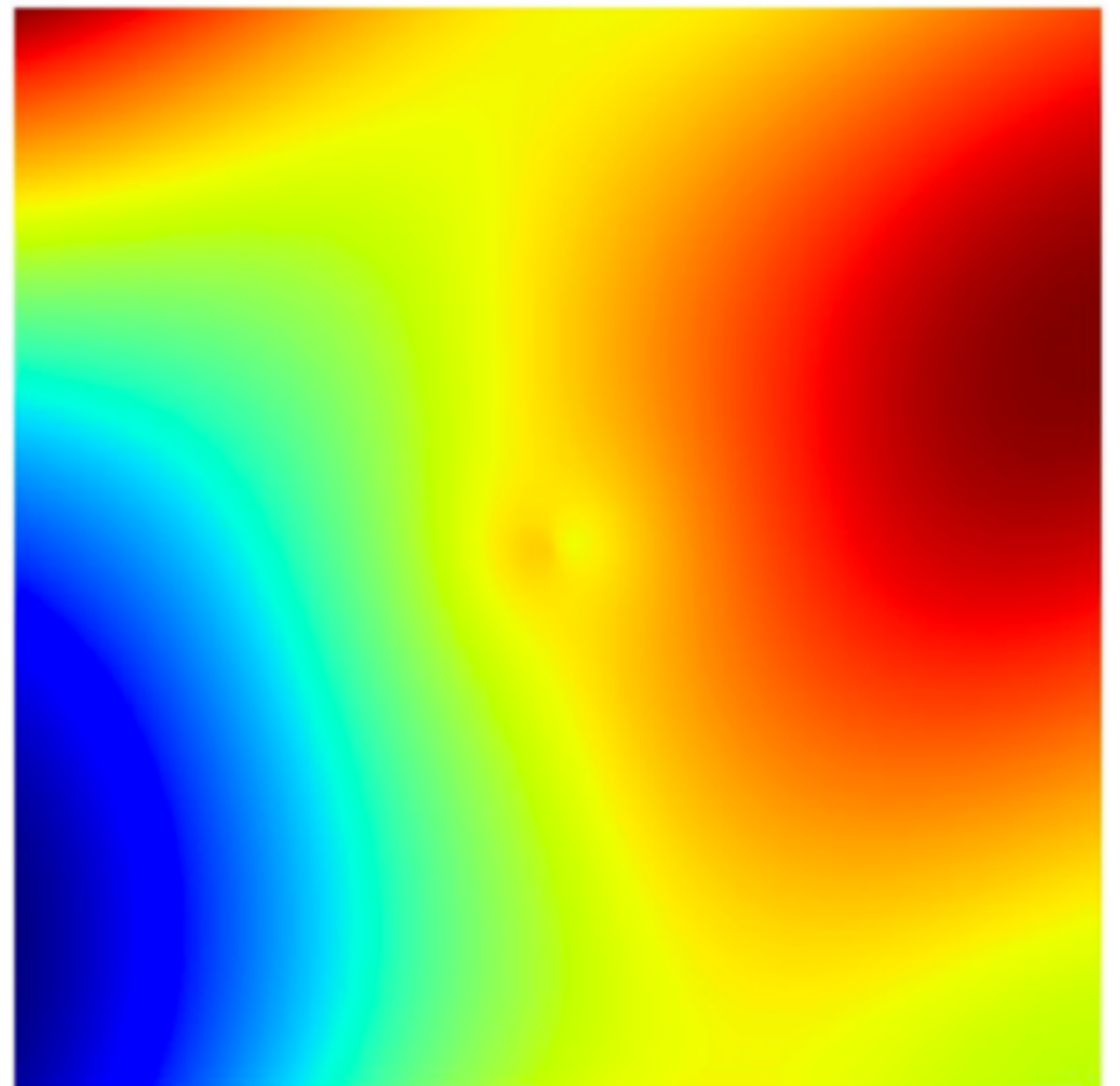
Don't need to measure galaxy shapes!

# “CMB Halo lensing” mass calibration

-Alex van Engelen

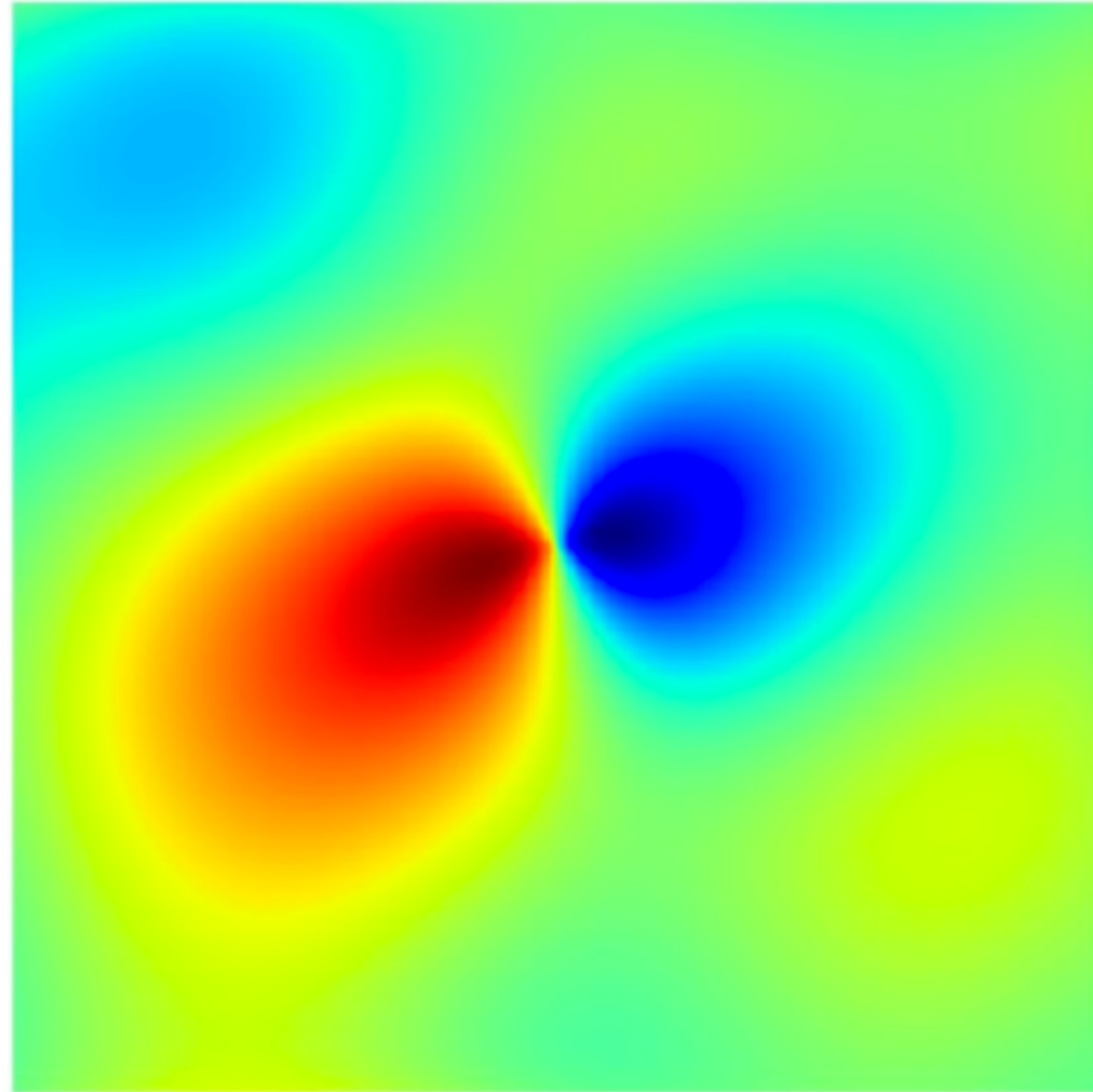


CMB



CMB + cluster

# CMB Halo lensing mass calibration

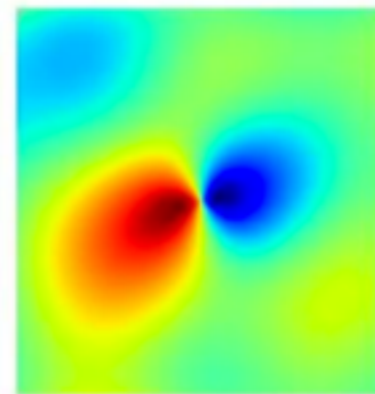
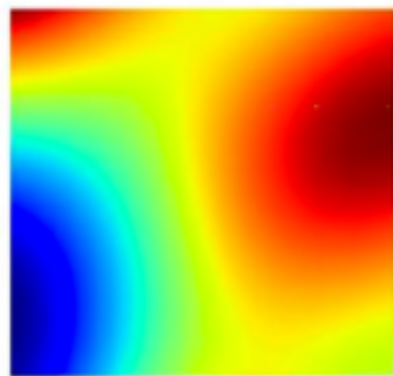


The difference is a dipole

# CMB Halo lensing quadratic estimator

Large-scale gradient    Small-scale dipole

$$\hat{\kappa} \propto \vec{\nabla} \cdot \left[ \left[ \vec{\nabla} T \right]_{\text{low}} \left[ T(\vec{\theta}) \right]_{\text{high}} \right]$$

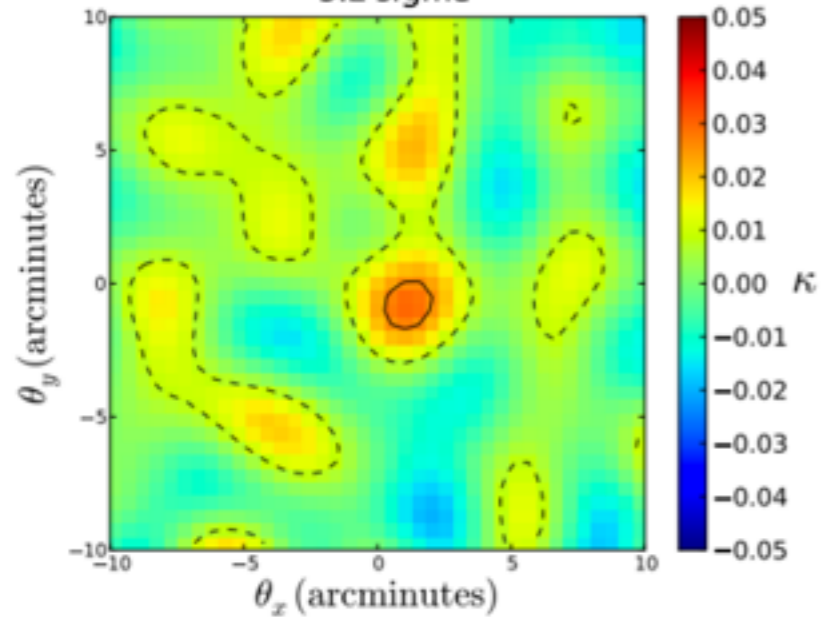


Hu, DeDeo, Vale 2007

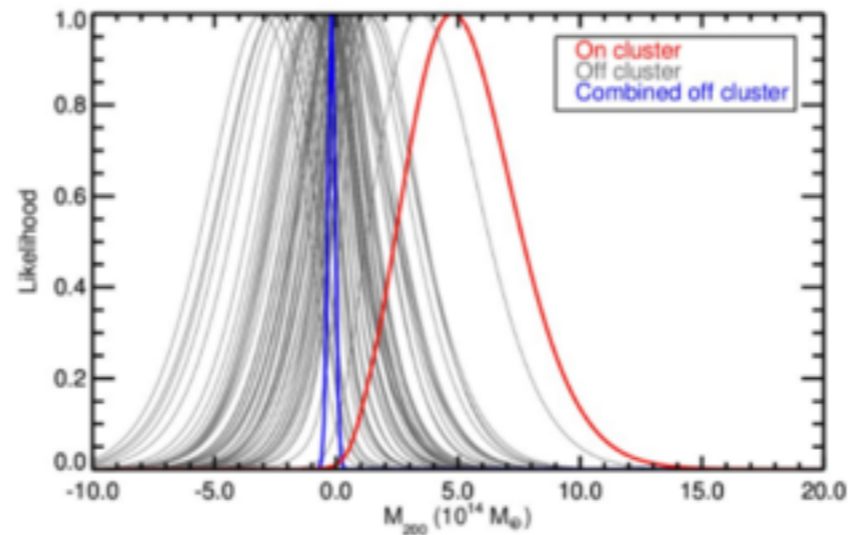
## Maximum Likelihood estimators

# CMB Halo lensing detections

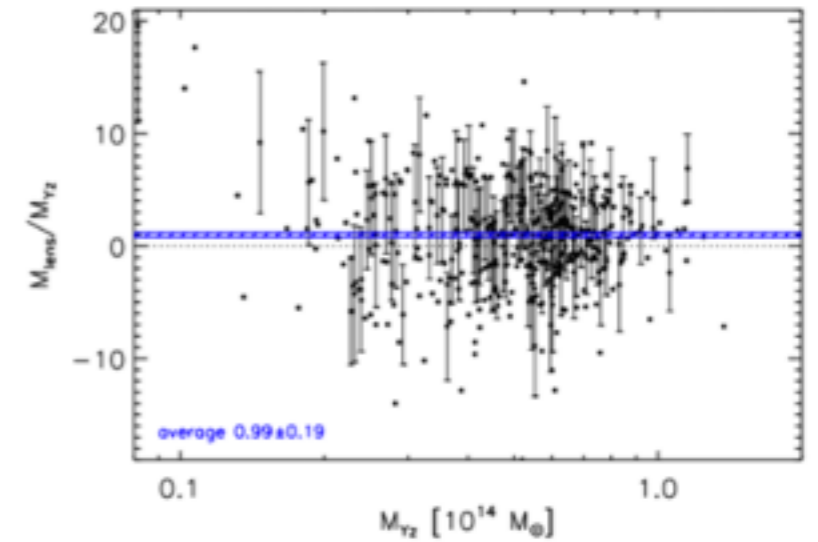
Madhavacheril + ACTPol (PRL 2015)  
3.2 sigma



Baxter et. al (SPT)  
3 sigma



Planck 2015  
5 sigma

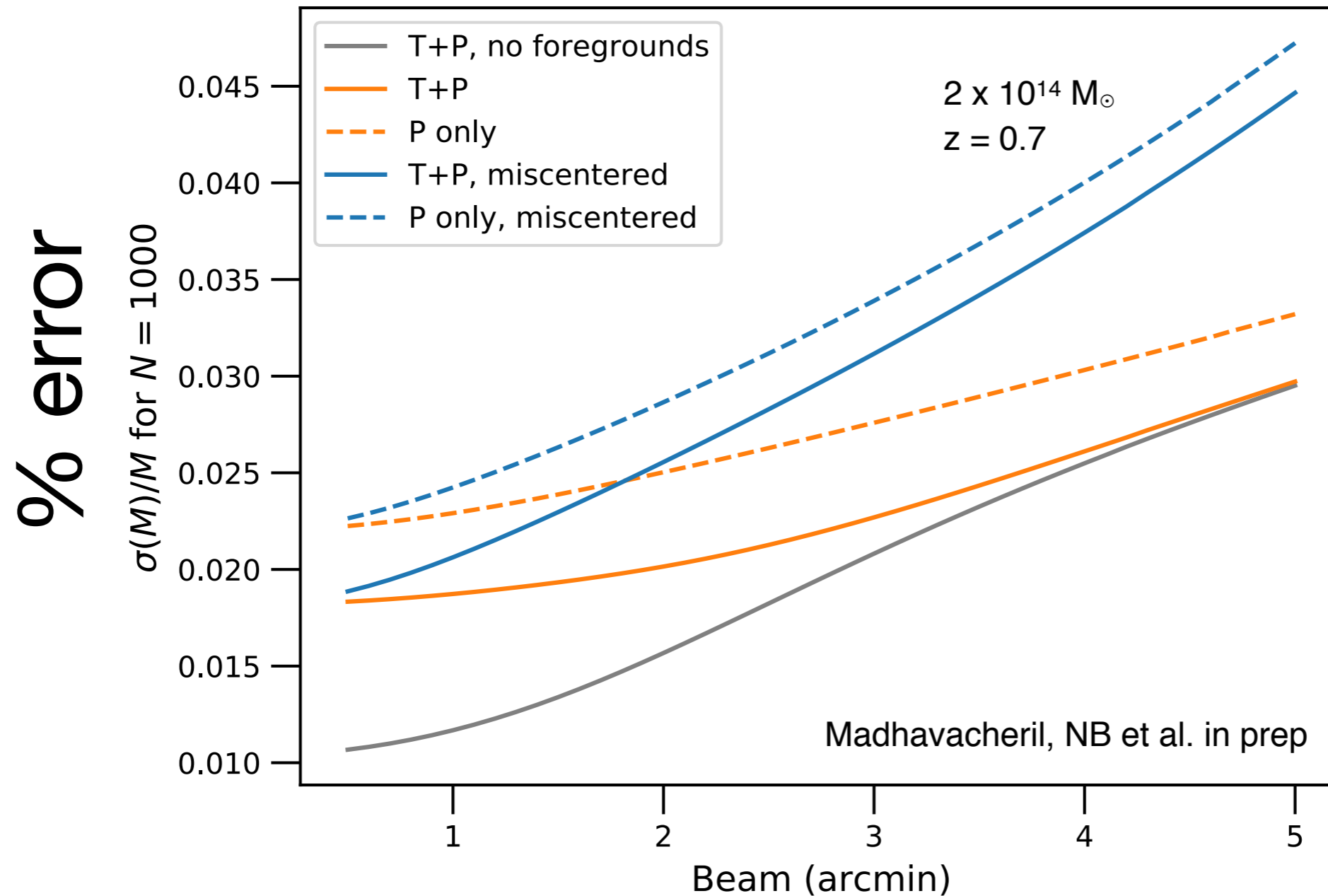


Early days for CMB halo lensing

Different techniques / estimators / samples

However, the data is getting better

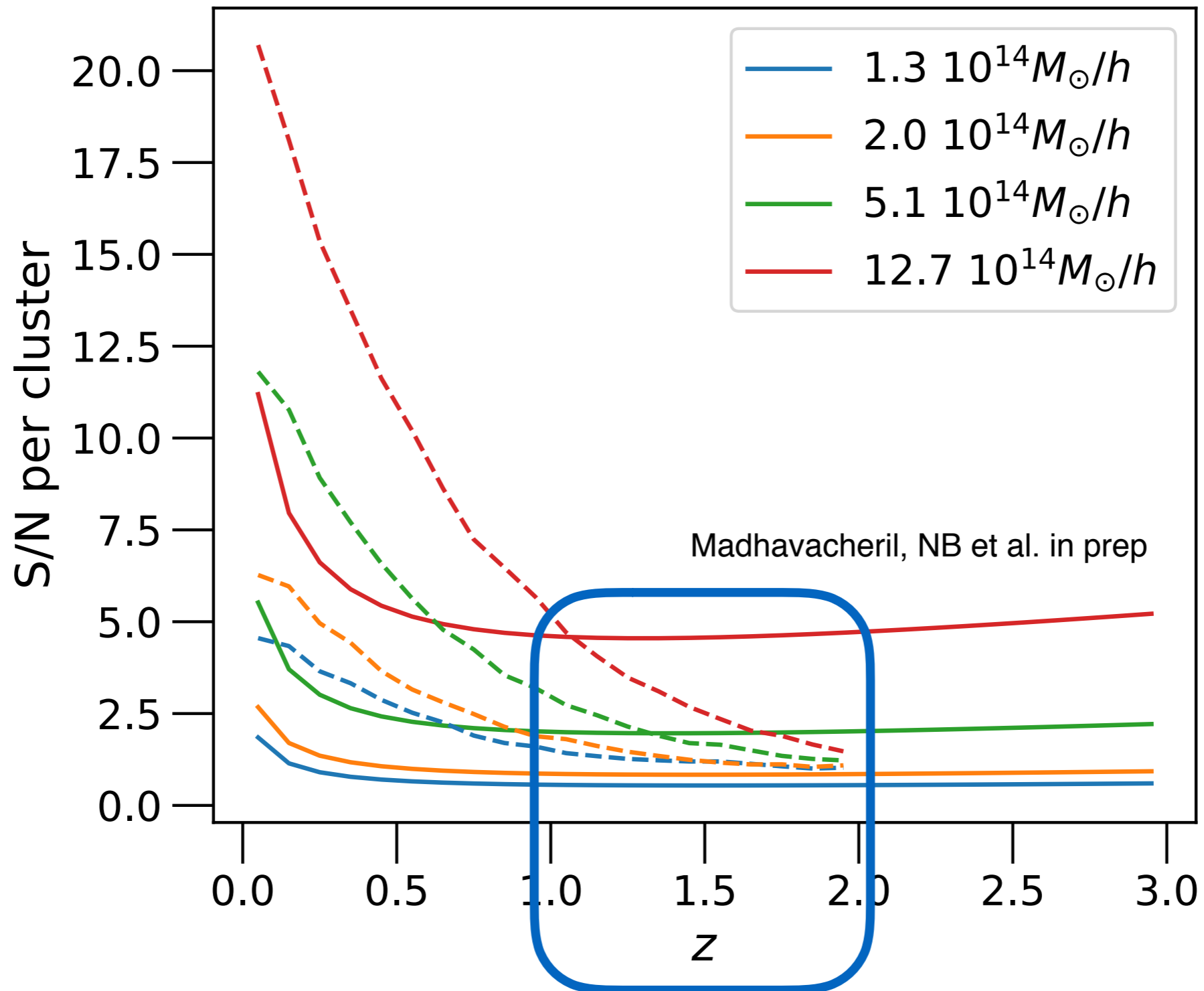
# CMB Halo lensing estimator - CMBS4



Strong function of the beam size

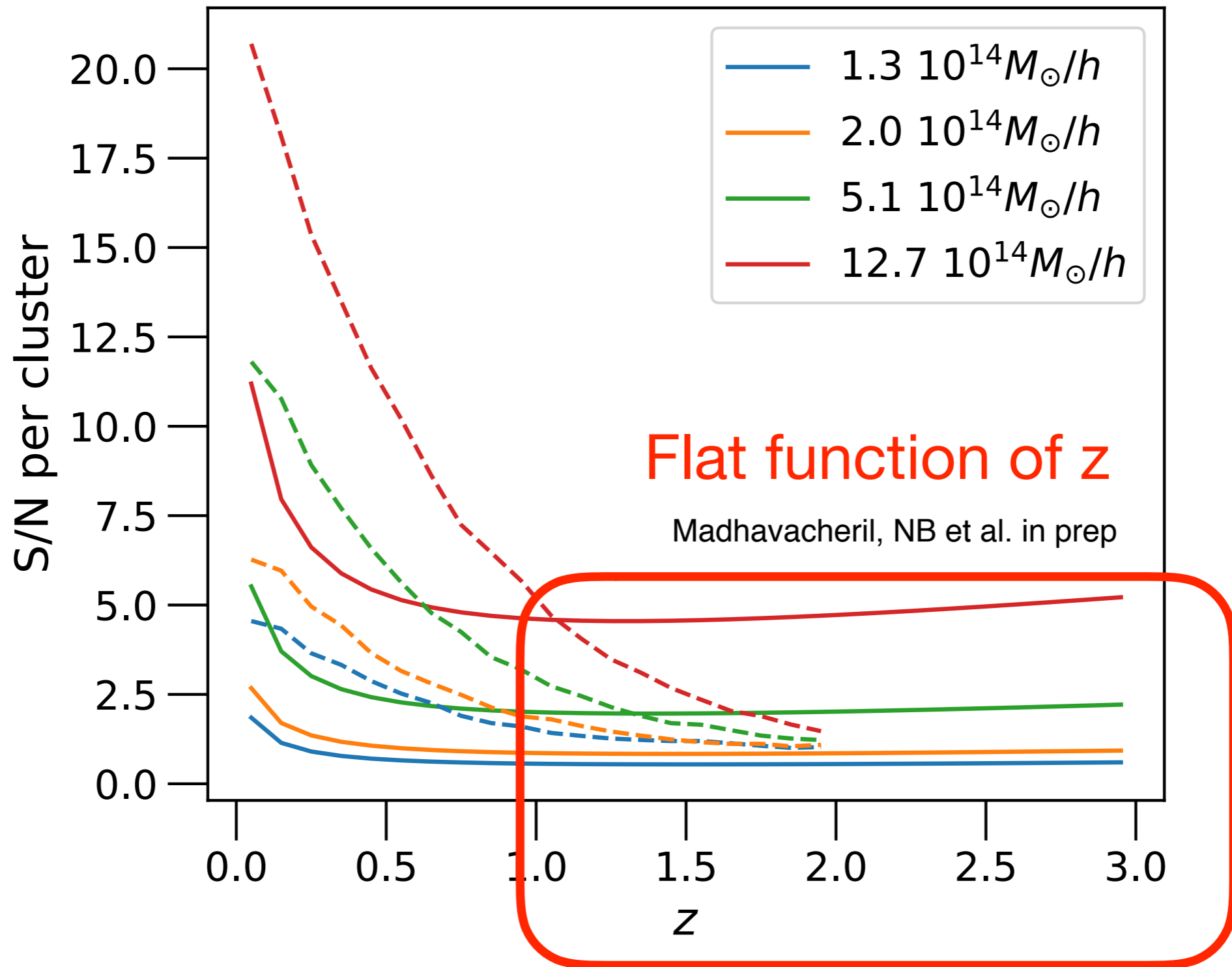
Removal of foregrounds is one of the key systematics

# Optical vs CMB halo lensing



Transitions from optical to CMB halo lensing

# Optical vs CMB halo lensing



Independent systematics from optical weak-lensing measurements



# Take aways

- Velocity dispersions...
- Calibrate SZ, X-ray, Optical relations
- Please fit scaling relations with ML methods
- CMB-S4 will provide large, well defined sample of clusters  $z > 2$
- CMB halo lensing is a new opportunity to measure masses at all redshifts

“Masses, what [are they] good for?”