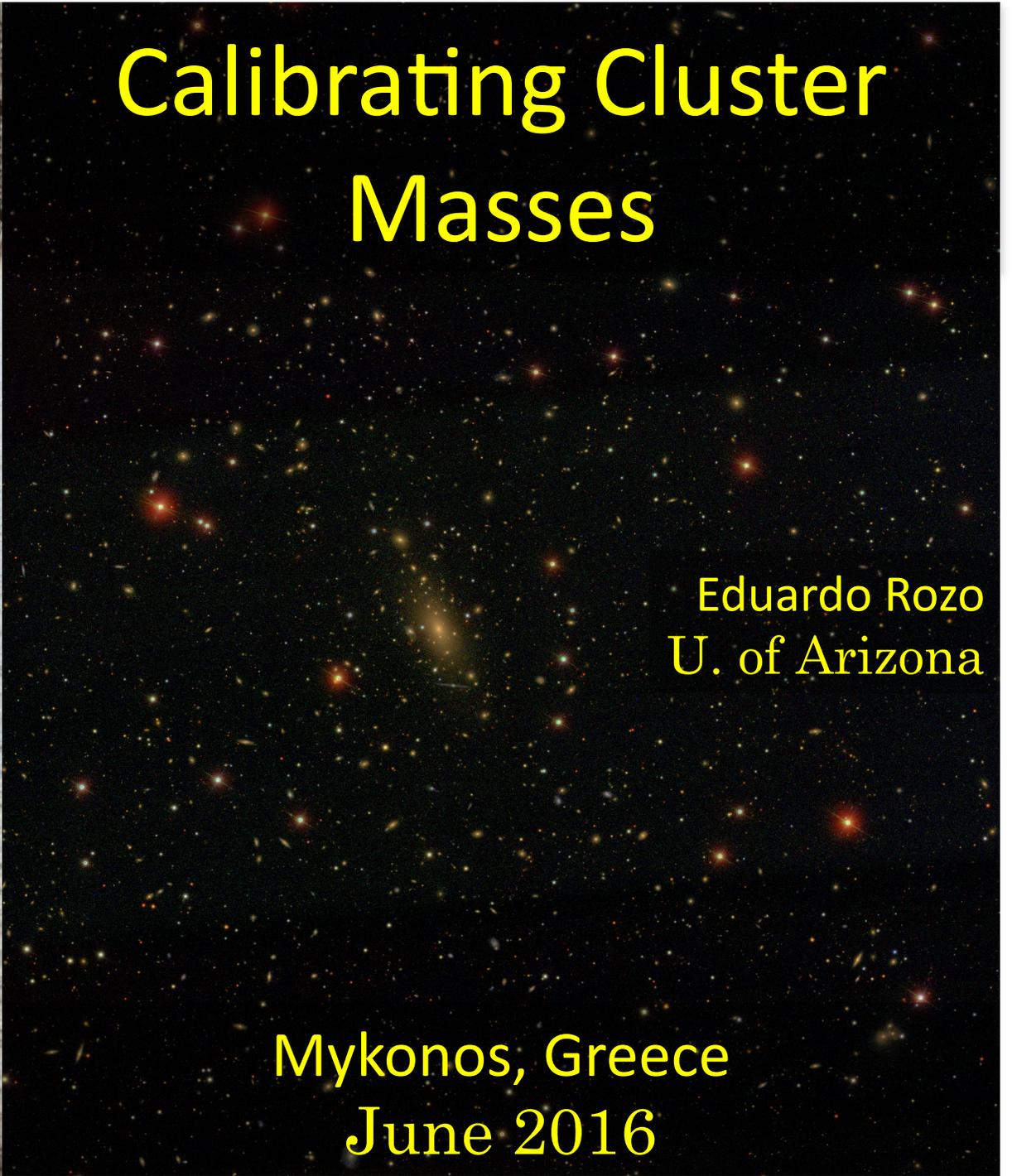


Calibrating Cluster Masses

Eduardo Rozo
U. of Arizona

Mykonos, Greece
June 2016



In collaboration with

Peter Melchior
Daniel Gruen
Thomas McClintock
Erin Sheldon
Tamas Varga
DES Collaboration

Melanie Simet
Thomas McClintock
Rachel Mandelbaum

Eric Baxter
Bhuvnesh Jain

Eli Rykoff

Risa Wechsler

Cluster Cosmology in 3 Easy Steps

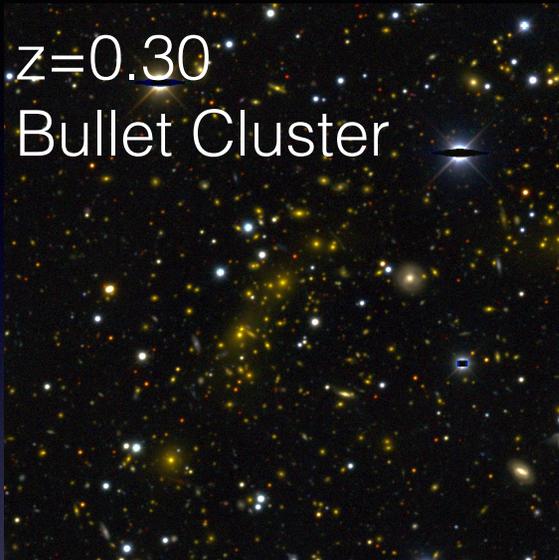
1. Find all galaxy clusters.
2. Measure cluster masses.
3. Learn about gravity and dark energy!

Cluster Cosmology in 3 Easy Steps

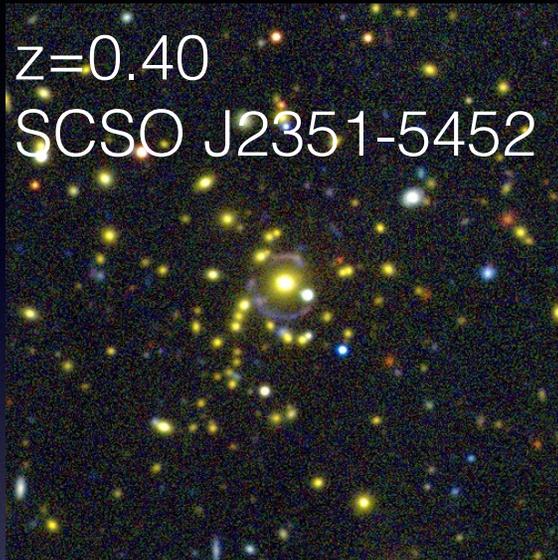
1. Find all galaxy clusters.
 - rely on photometrically identified galaxy clusters (redMaPPer)
 - two distinct data sets: SDSS and DES.

Rogue's Gallery

$z=0.30$
Bullet Cluster



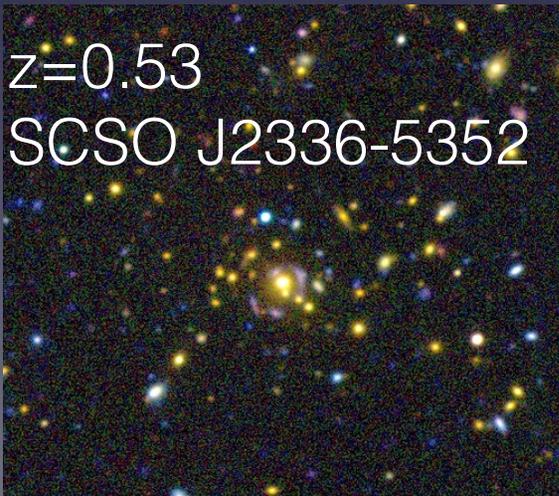
$z=0.40$
SCSO J2351-5452



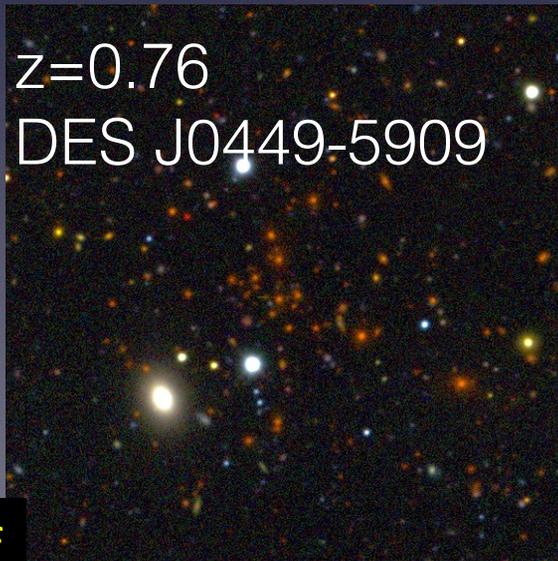
$z=0.87$
"El Gordo"



$z=0.53$
SCSO J2336-5352



$z=0.76$
DES J0449-5909



$z=0.83$
DES J0250+0008

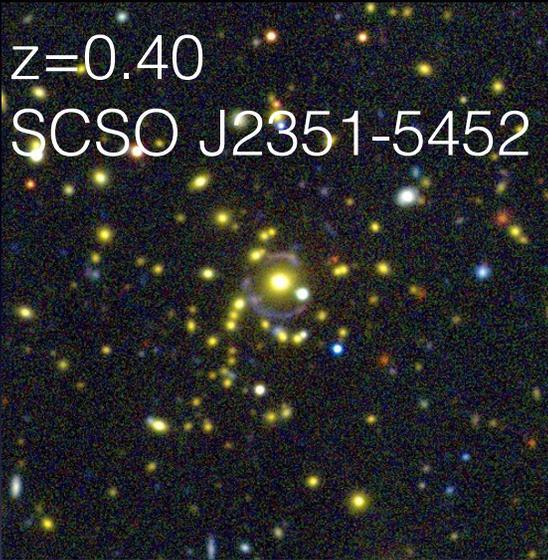


Rogue's Gallery

$z=0.30$
Bullet Cluster



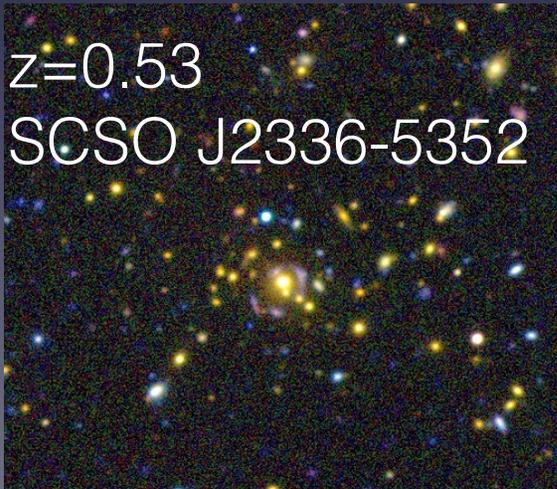
$z=0.40$
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"El Gordo"



$z=0.53$
SCSO J2336-5352



$z=0.76$
DES J0449-5909



$z=0.83$
DES J0250+0008



Cluster Cosmology in 3 Easy Steps

1. Find all galaxy clusters.
2. **Measure cluster masses.**
 - This is the thing that limits the precision of cluster cosmology!
 - Want $P(\text{Mass} | \text{Observable})$
 - Focus primarily on DES analysis.

(Brief Aside)

Relation between **mass** and **observable (X)** is statistical.

$$M(X) = AX^\alpha$$

This notation is ambiguous! Does it mean this?

$$\langle M | X \rangle = AX^\alpha$$

Or this?

$$\langle \ln M | X \rangle = \ln A + \alpha \ln X$$

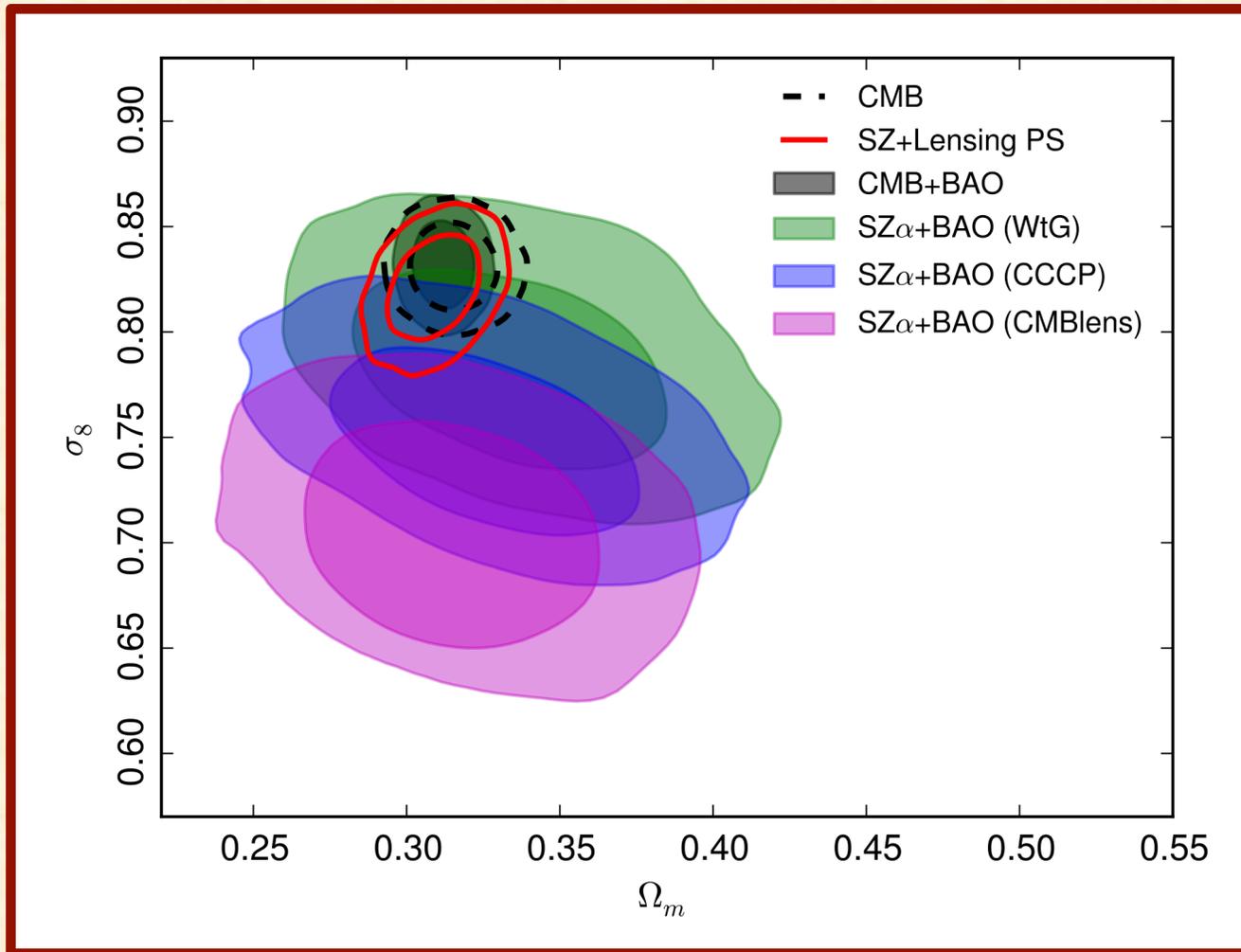
These two are
not equivalent
Offsets relevant
at $\approx 1\sigma$.

DIDN'T USE PROPER NOTATION?

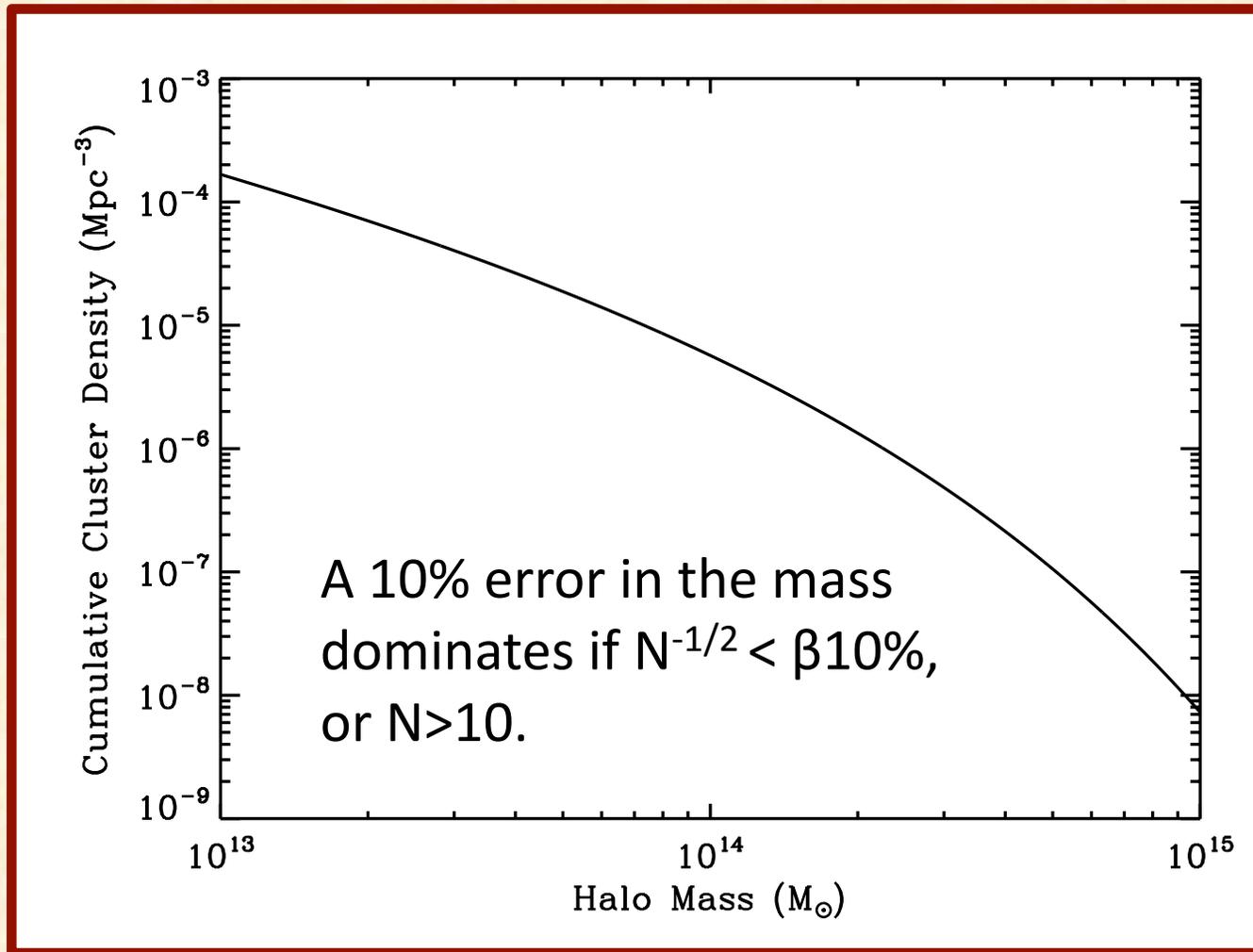


THAT'S A PADDLIN

The Impact of Mass Calibration

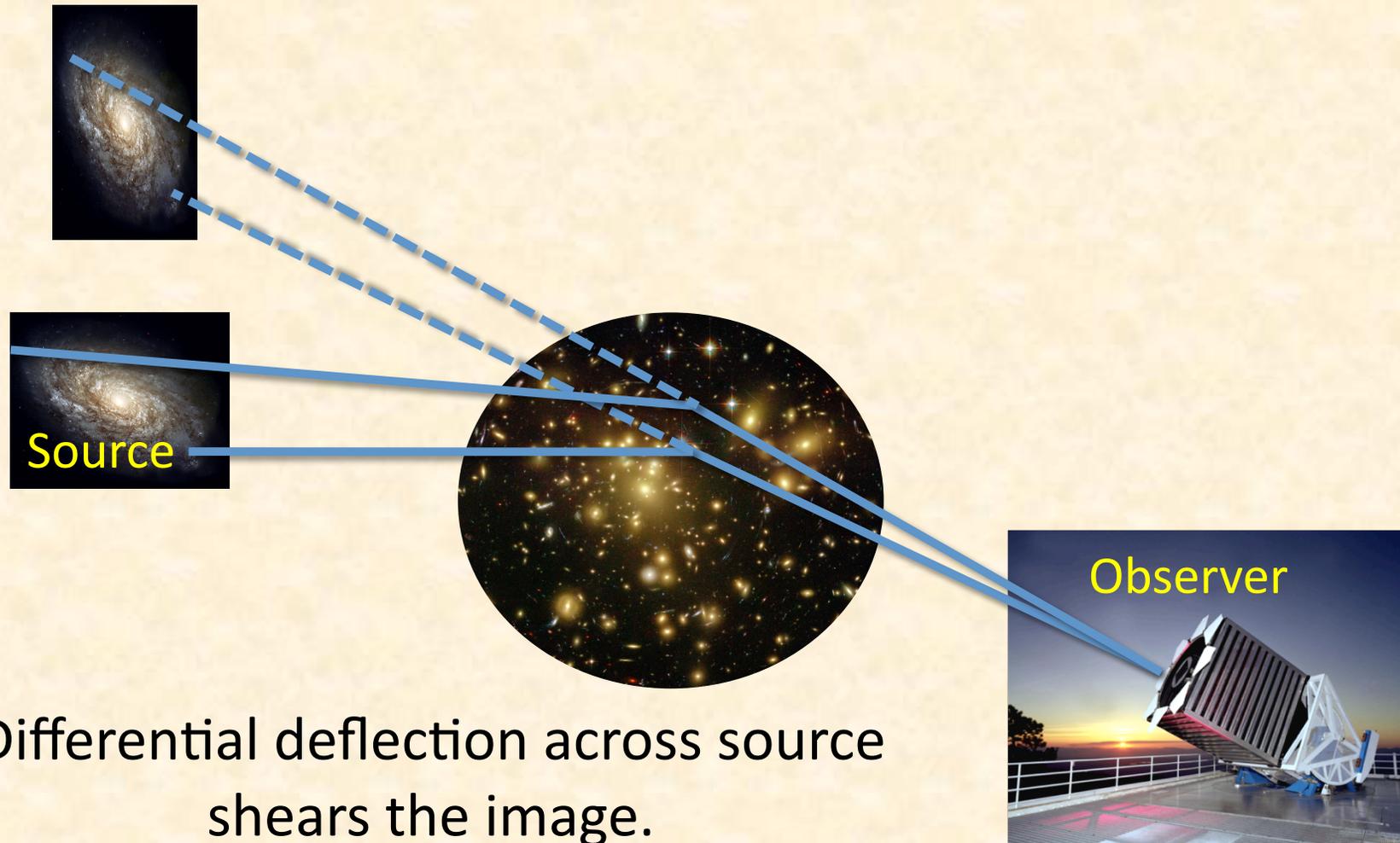


Why Mass Calibration Matters



Weak Lensing Mass Calibration

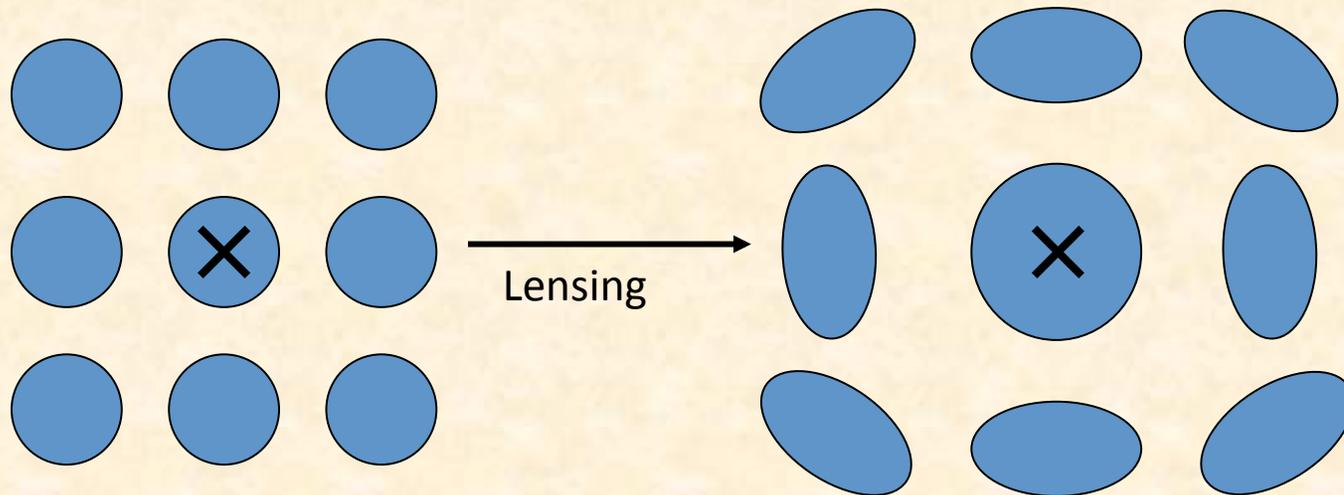
The gravity of a galaxy cluster bends the light of galaxies behind it.



Differential deflection across source shears the image.

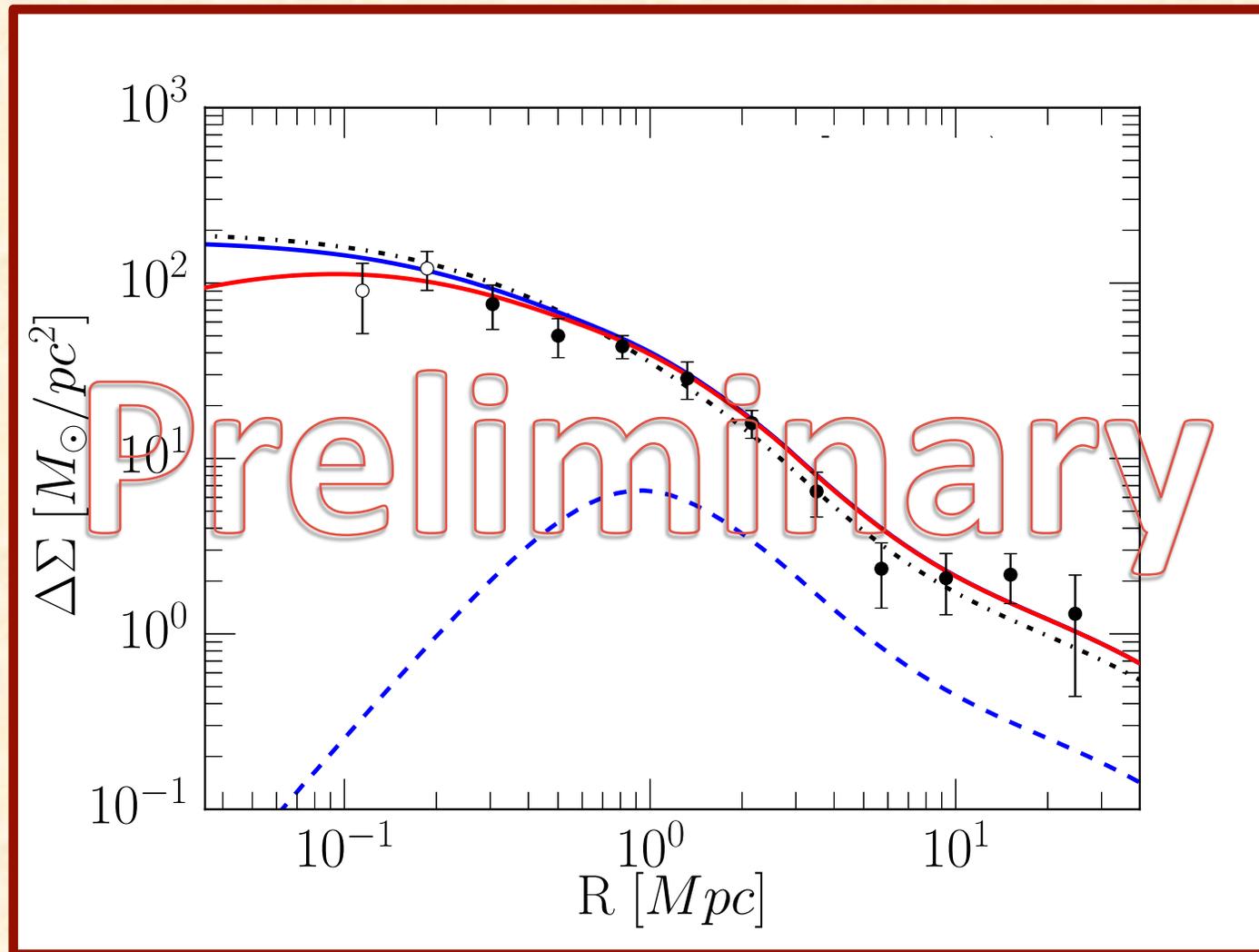
Weak Lensing Mass Calibration

We can detect *shear* statistically:



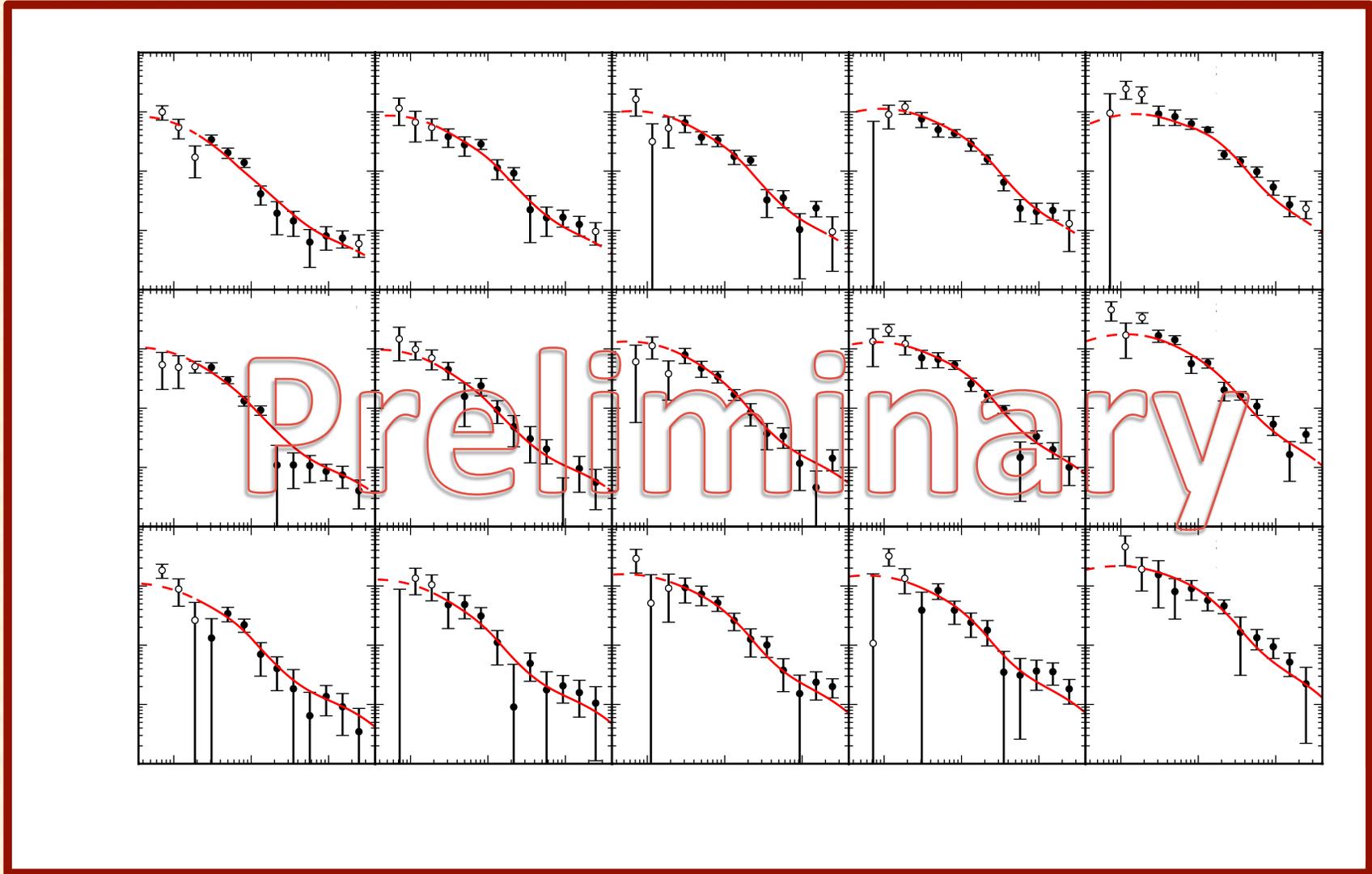
The mean tangential ellipticity of *background* galaxies around galaxy clusters depends on the cluster mass.

Mass Calibration of DES SV Clusters



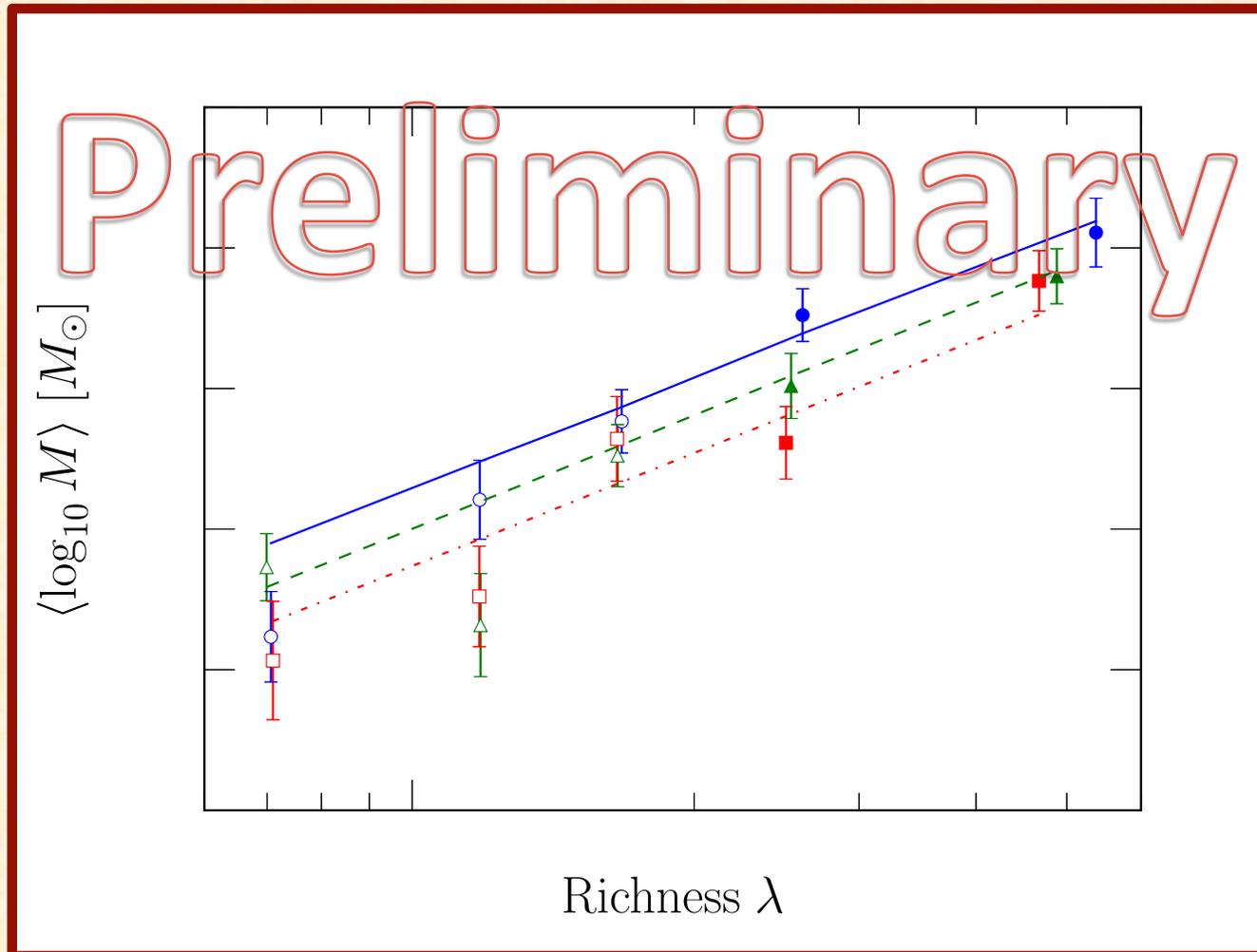
Melchior et al., in prep., plot by Tom McClintock

Mass Calibration of DES SV Clusters



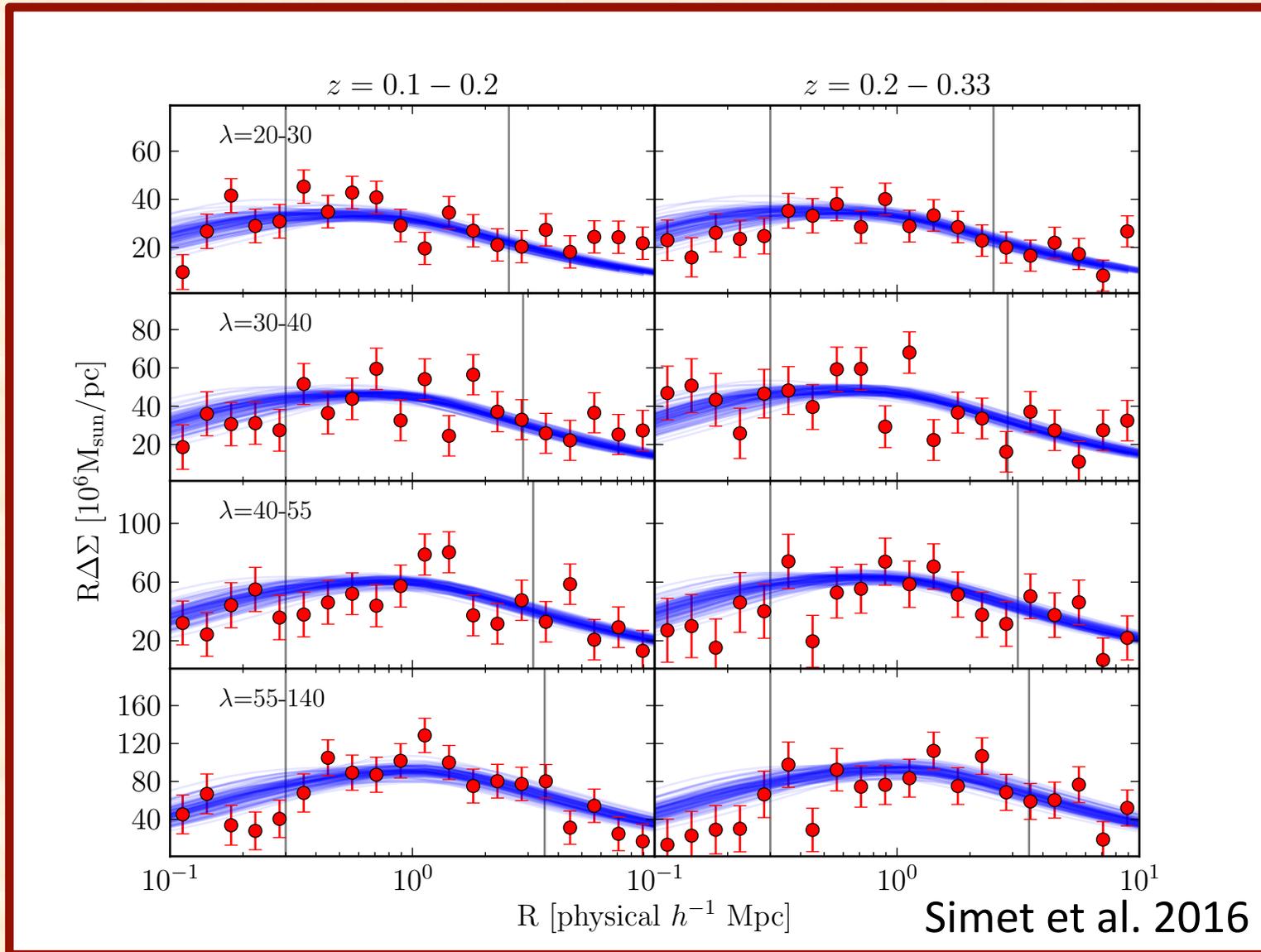
Melchior et al., in prep., plot by Tom McClintock

The Mass-Richness Relation in DES SV



Melchior et al., in prep., plot by Tom McClintock

Mass Calibration of SDSS Clusters



End Result

DES SV: (UPDATE AFTER UNBLINDING)

$$\log_{10} \langle M \mid \lambda \rangle = (14.X \pm X \pm X) + (1.X_{-X}^{+X}) \log_{10} \left(\frac{\lambda}{30} \right)$$

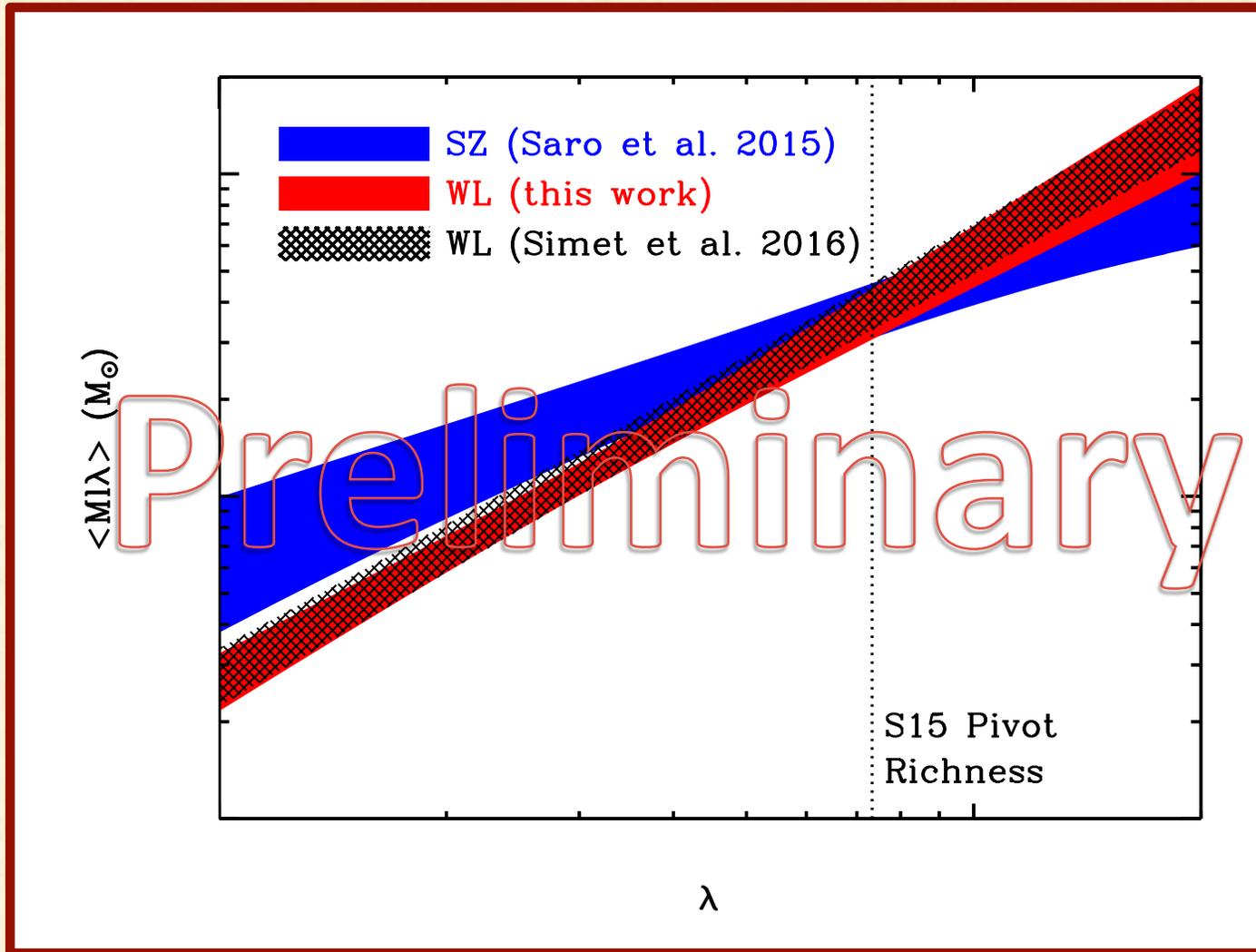
Note- units are M_{\odot} , $z_{\text{pivot}}=0.6$

SDSS:

$$\log_{10} \langle M \mid \lambda \rangle = (14.344 \pm 0.021 \pm 0.023) + (1.33_{-0.10}^{+0.09}) \log_{10} \left(\frac{\lambda}{40} \right)$$

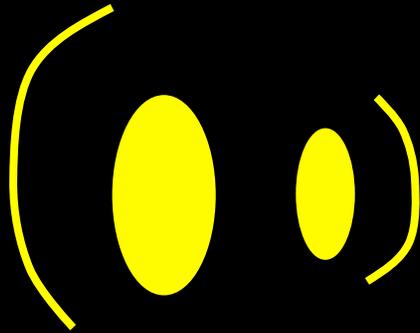
Note- units are $h^{-1} M_{\odot}$, $z_{\text{pivot}}=0.25$

Comparison of DES and SDSS



Systematics

(The Monster in the Dark)





Our Approach to Systematics

End Result

DES SV: (UPDATE AFTER UNBLINDING)

$$\log_{10} \langle M \mid \lambda \rangle = (14.X \pm X \pm X) + (1.X_{-X}^{+X}) \log_{10} \left(\frac{\lambda}{30} \right)$$

Note- units are M_{\odot} , $z_{\text{pivot}}=0.6$

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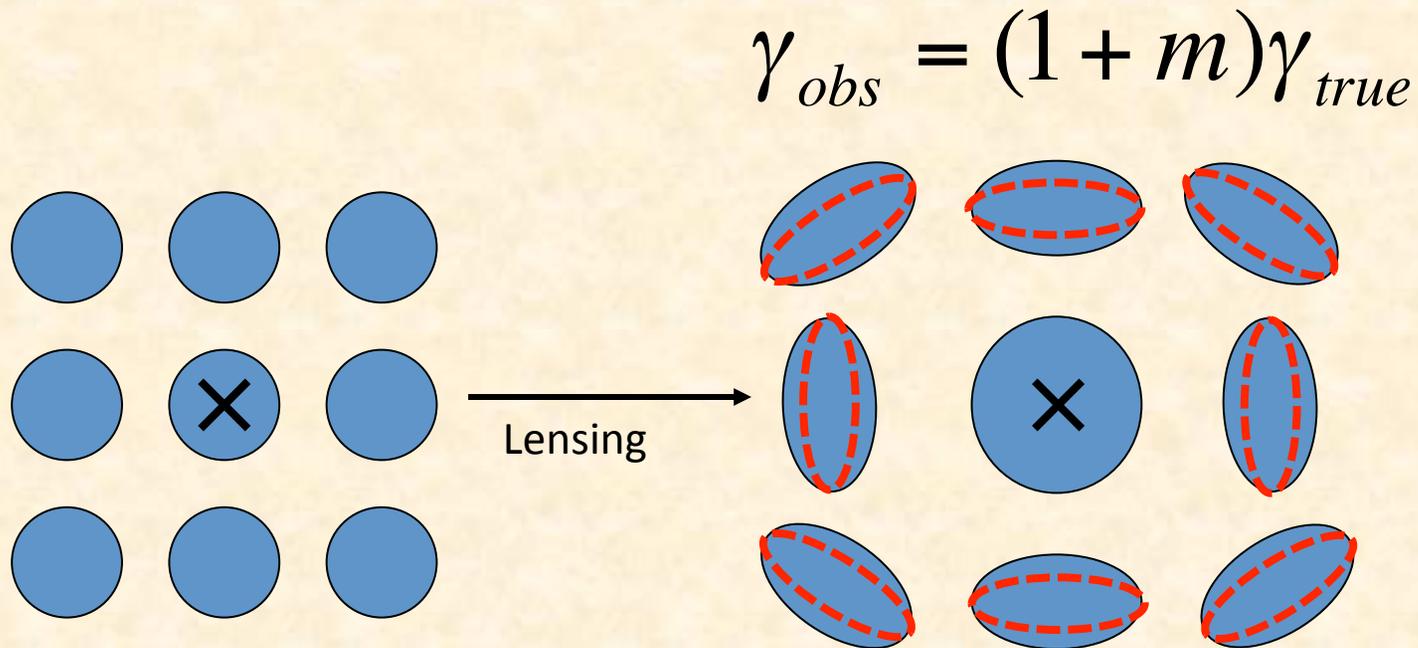
Note- units are $h^{-1} M_{\odot}$, $z_{\text{pivot}}=0.25$

Current List of Systematics

- **Shape systematics (4%)**
- **Photoz systematics (3%)**
- Triaxiality (2.0%)
- Projections (2.0%)
- Modeling Systematics (2.0%)
- Membership dilution. (1% or less)
- Cluster centering. (1% or less)

Systematics are essentially identical
for DES and SDSS.

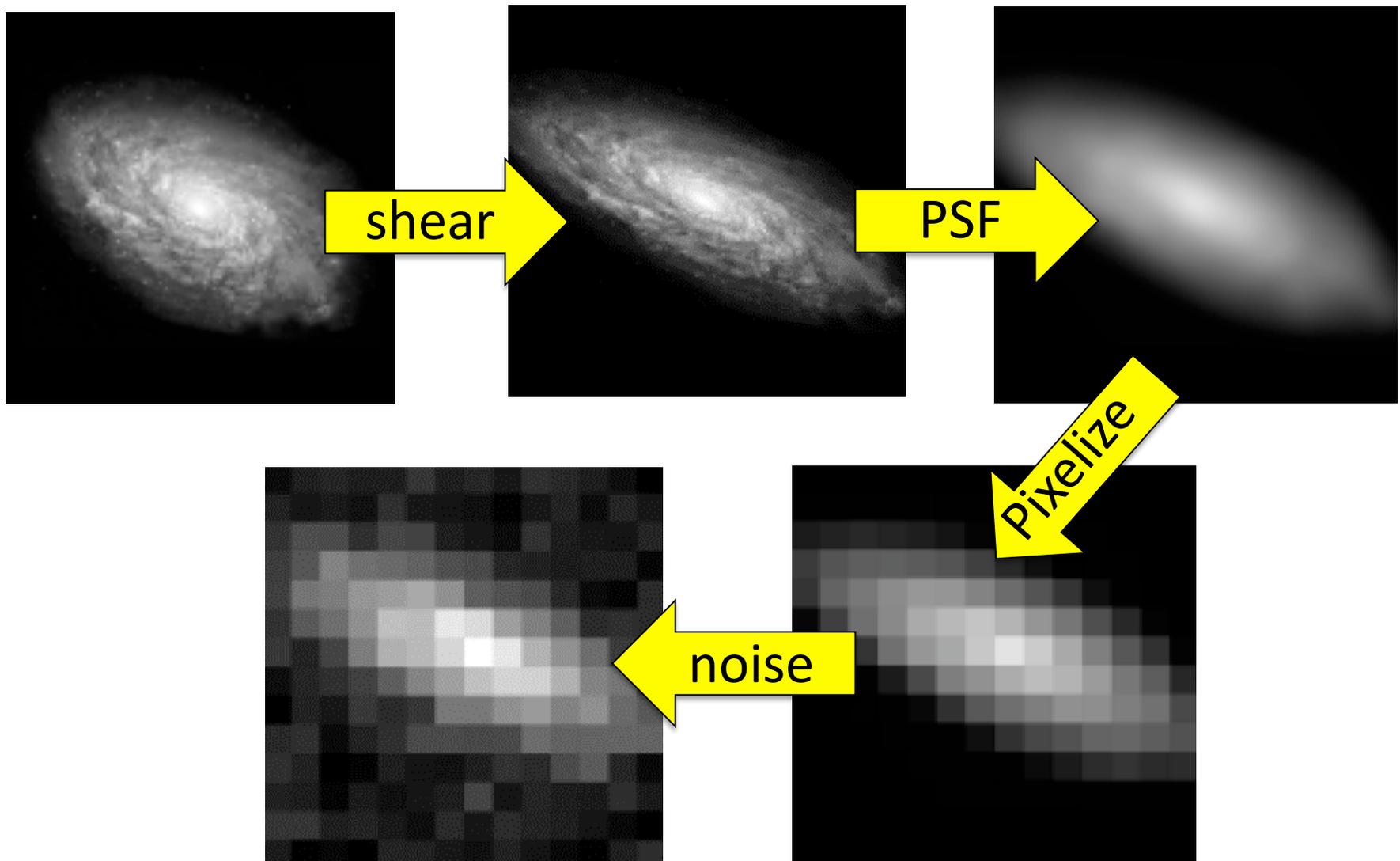
Why Shape Systematics Matter



Biased shear = biased mass

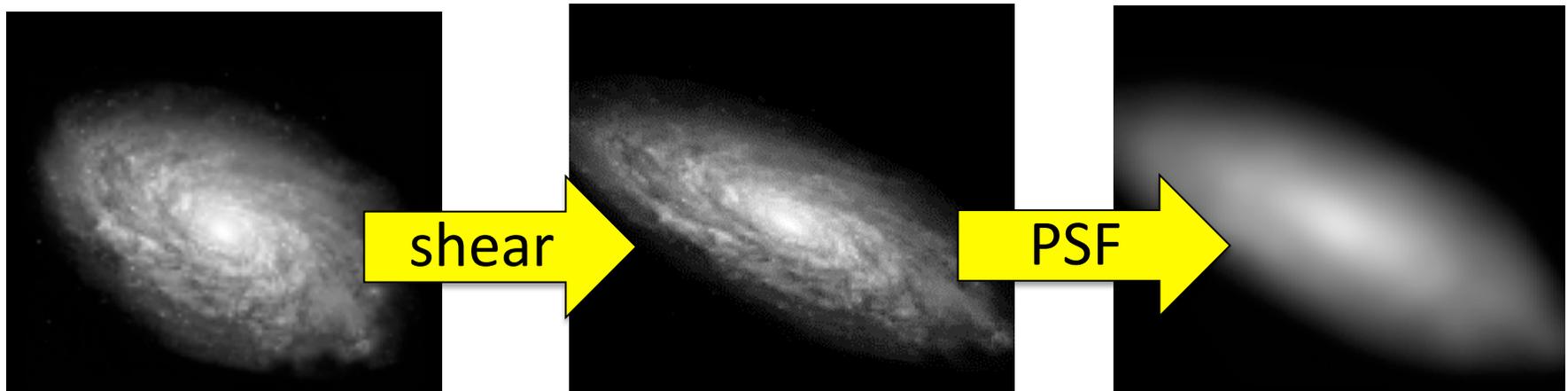
m = multiplicative shear bias

Why Shape Systematics Exist

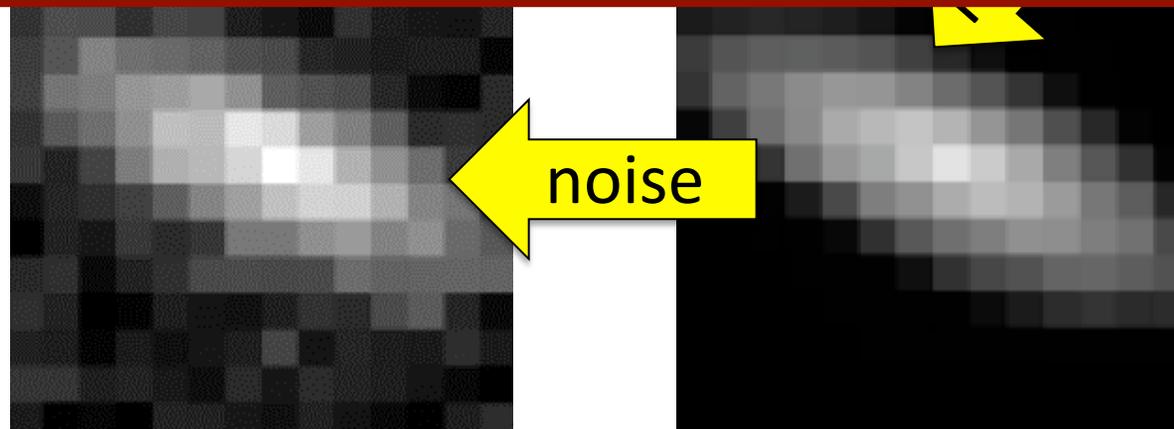


Images from talk by Thomas Kitching: www.nesc.ac.uk/talks/1003/16Kitching_lensing.pdf

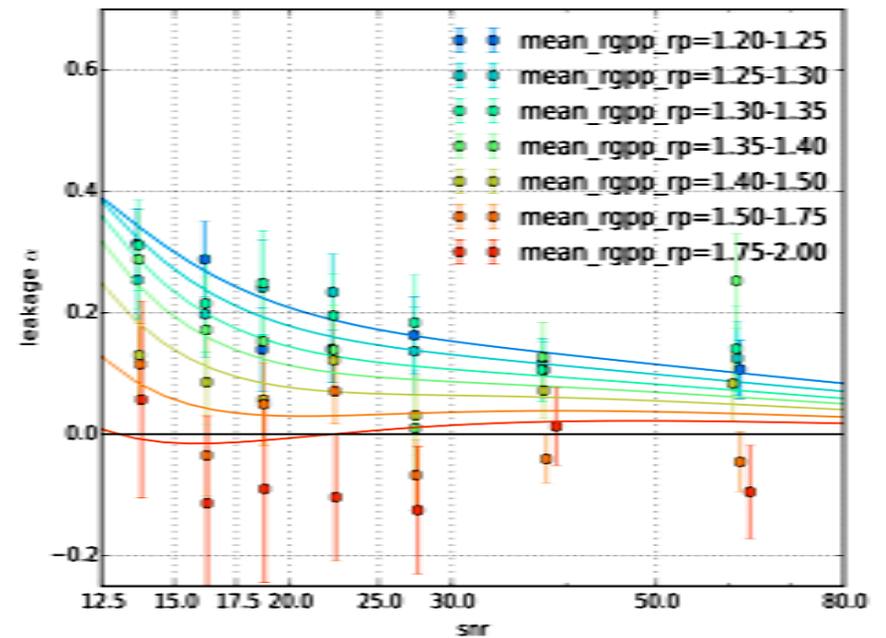
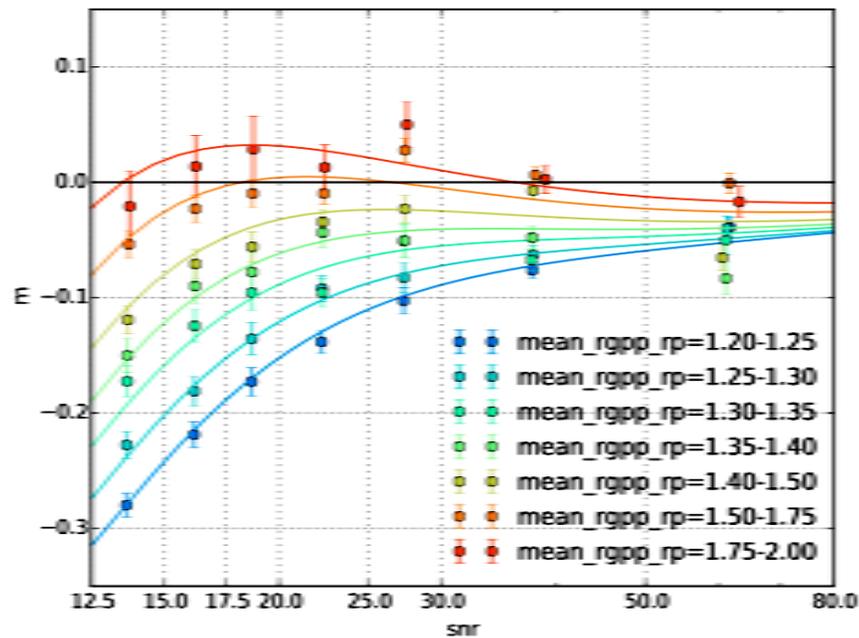
Why Shape Systematics Exist



Solution: Simulate!

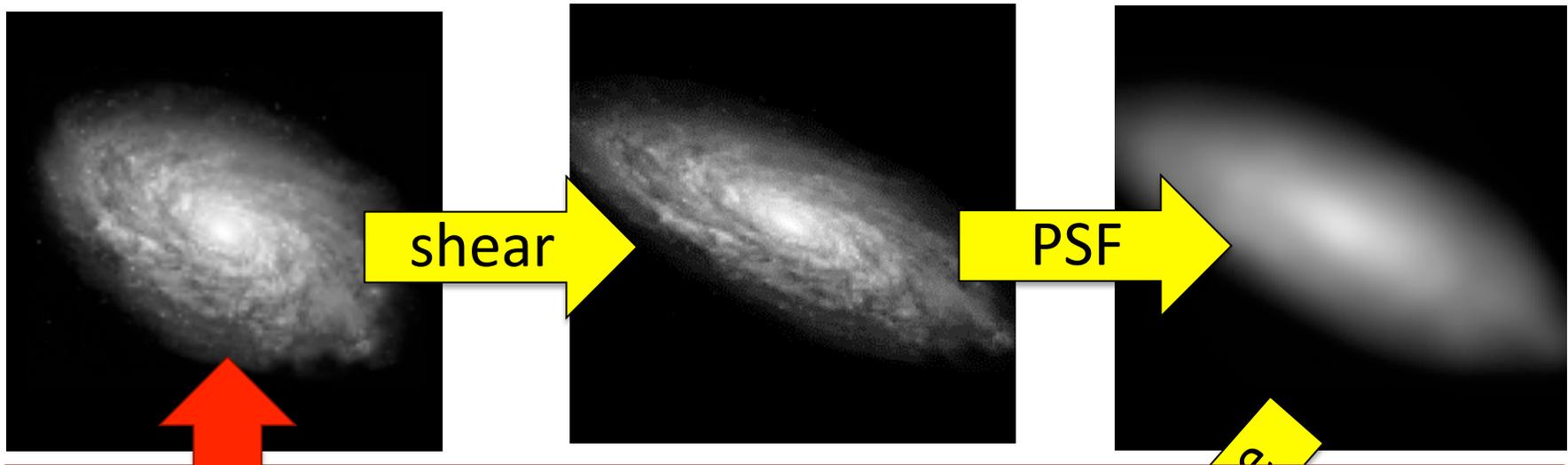


Shear Calibration



Residual systematics below 3% in simulations.

Simulations are Not Perfect



Most important difficulty:

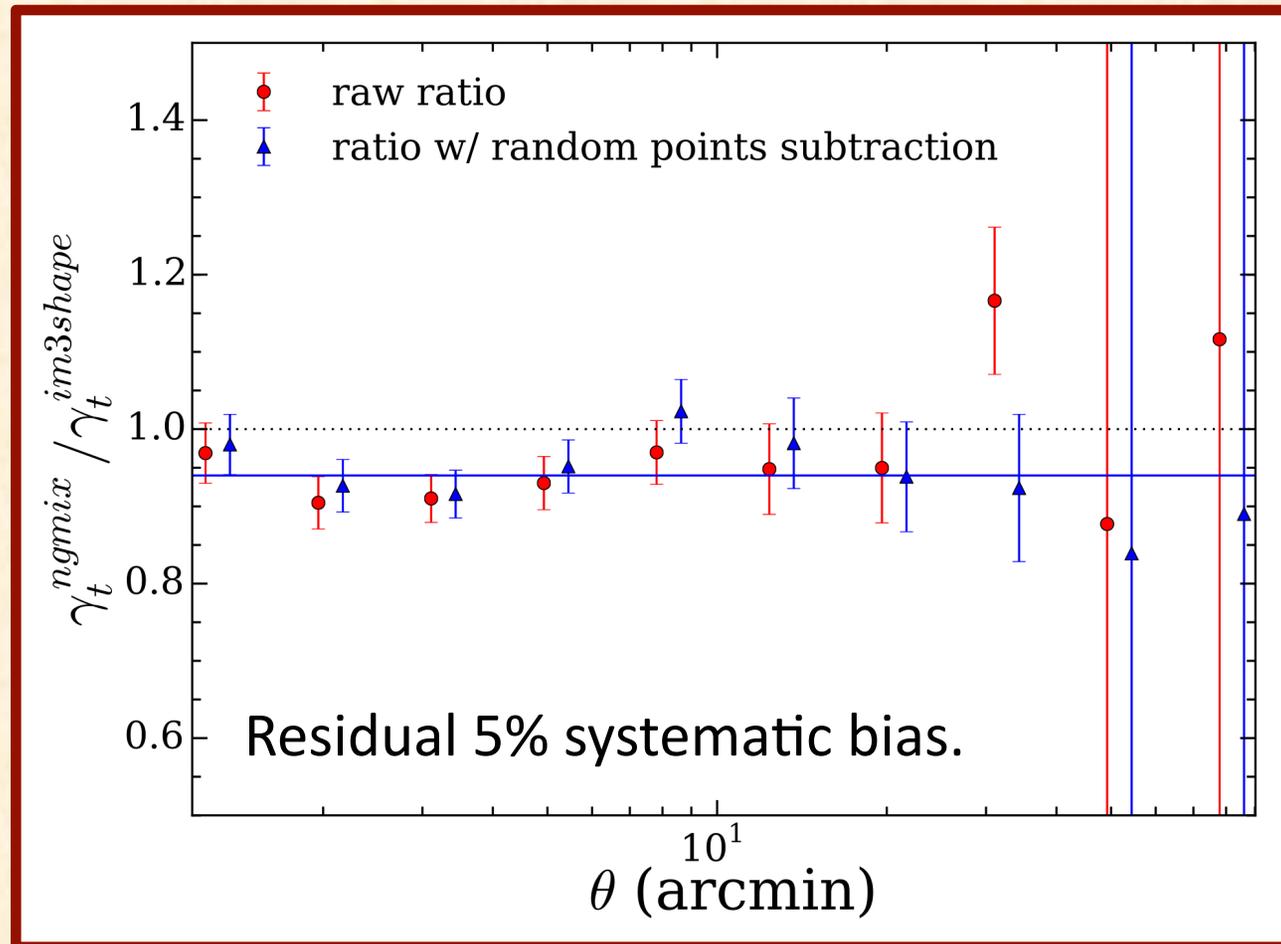
- Bias depends on detailed internal structure of galaxies.
- Differences between simulated and real galaxies results in shear biases.

How to Test if the Simulation Calibration is Good Enough?

Use two different calibrated methods for measuring shear.

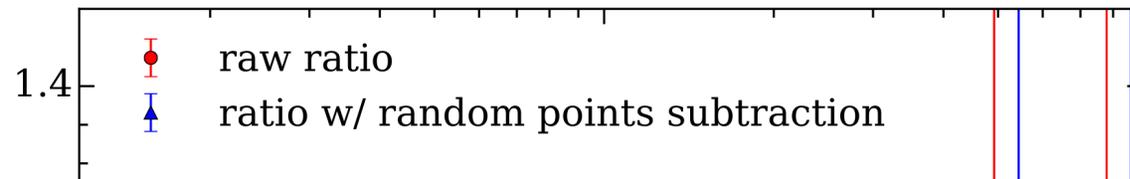
- Do they agree?

Residual Calibration Bias



This possible bias would have been undetected by simulations!

Residual Calibration Bias



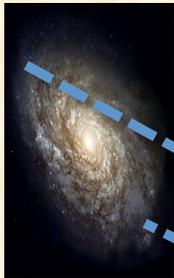
Bottom Line:

- 5% top-hat uncertainty in m .
- Prior is gaussianized (3%, or 4% in the mass)
- Identified because we had two independent source catalogs

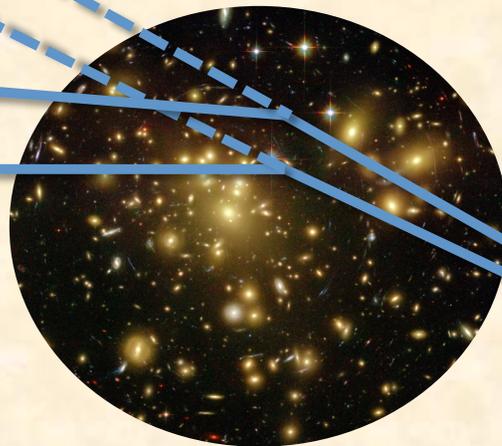
10^1
 θ (arcmin)

This possible bias would have been undetected by simulations!

Why Photoz Systematics Matter

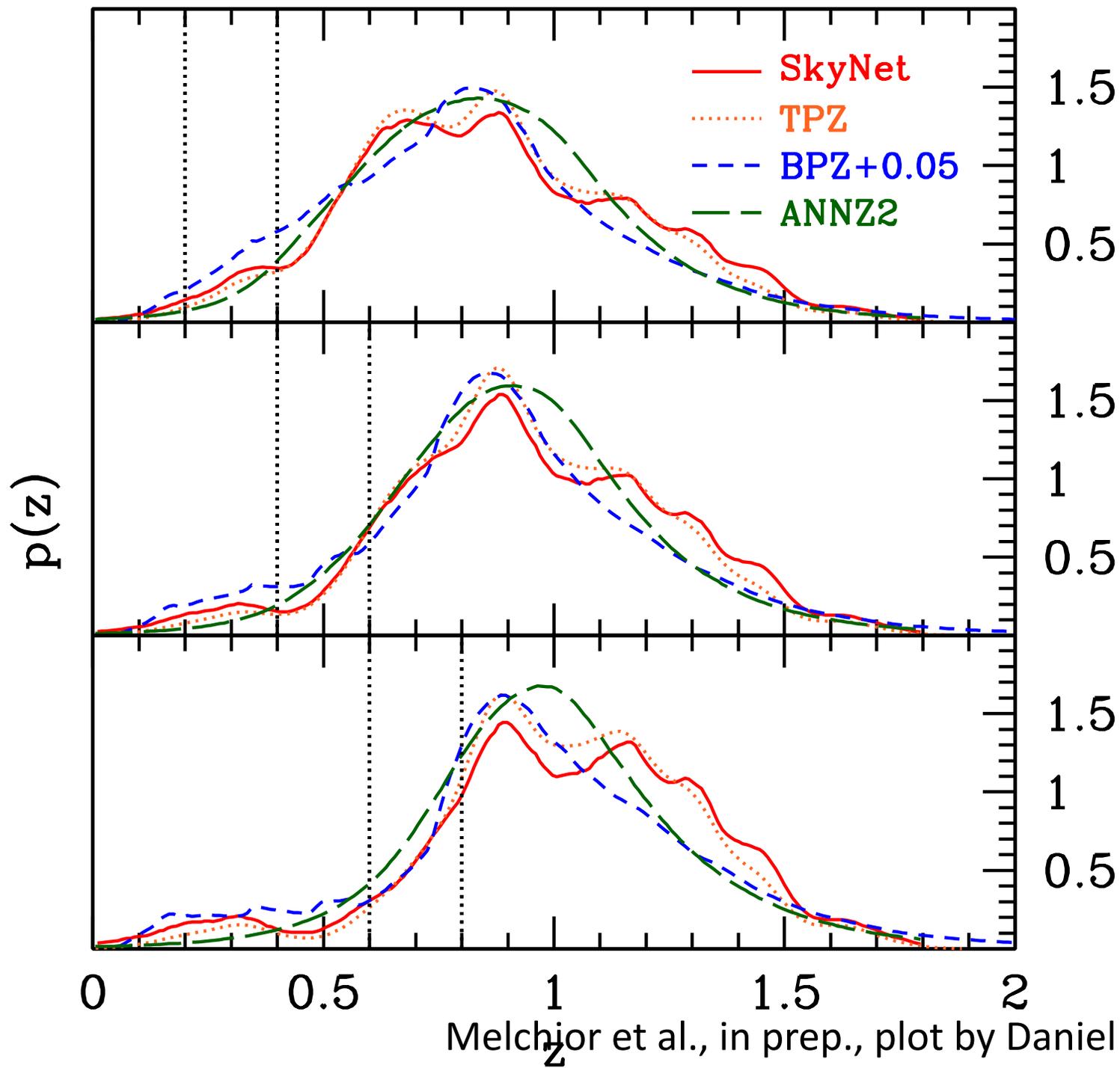


Distortion will depend on distance.
More distance = more distortion.
Distance is degenerate with mass!



**Wrong redshift = wrong distance
= wrong cluster mass**

Photoz Systematics



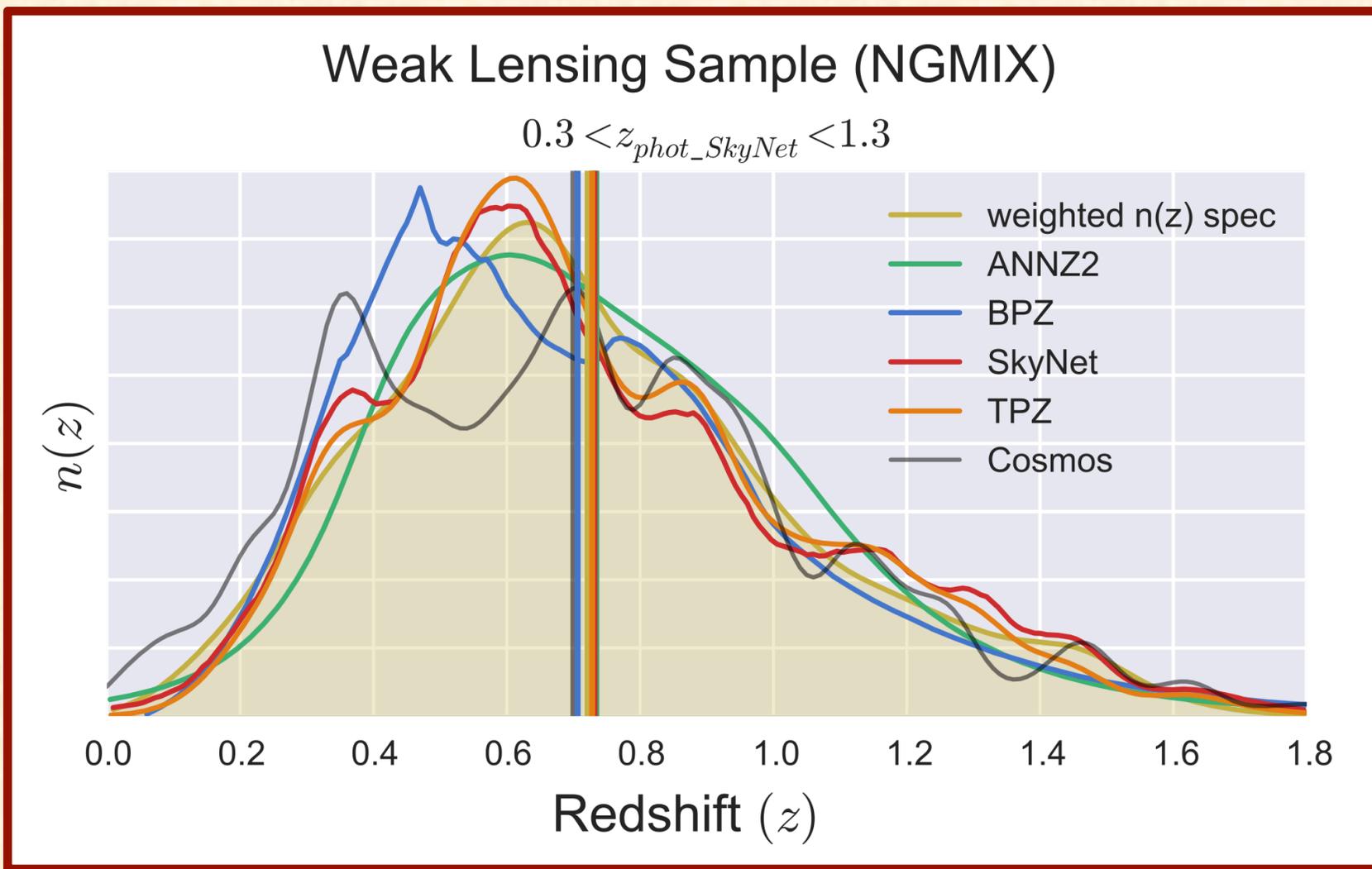
How to Test?

Compare predictions of photozs to spectroscopic redshift distribution.

Problem: spectra don't exist!

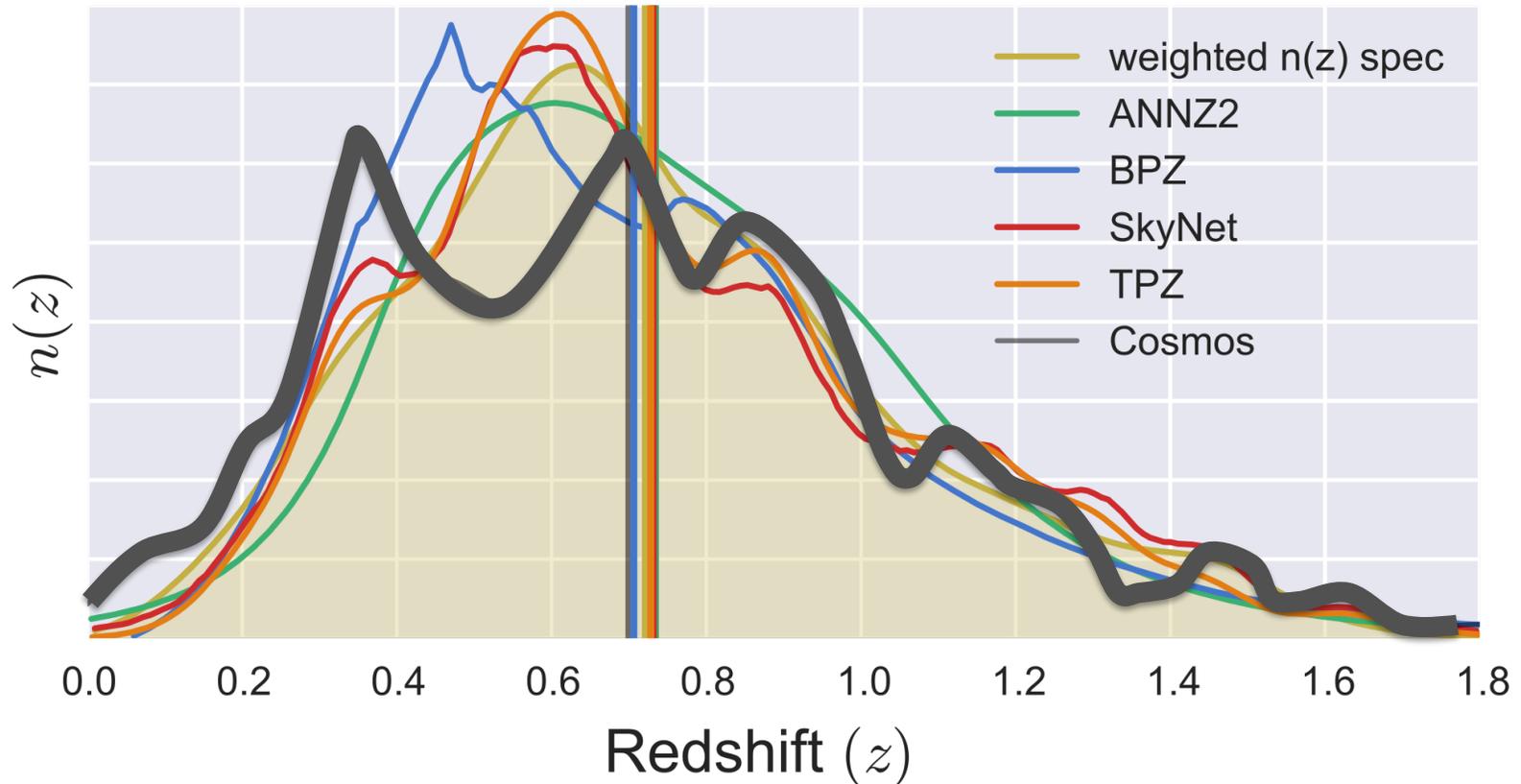
Solution: use COSMOS 30-band photozs to test.

COSMOS Test



COSMOS Test

Radial structure and differences with other methods suggests COSMOS by itself is not a sufficient test.



How to Test?

Compare predictions of photozs to spectroscopic redshift distribution.

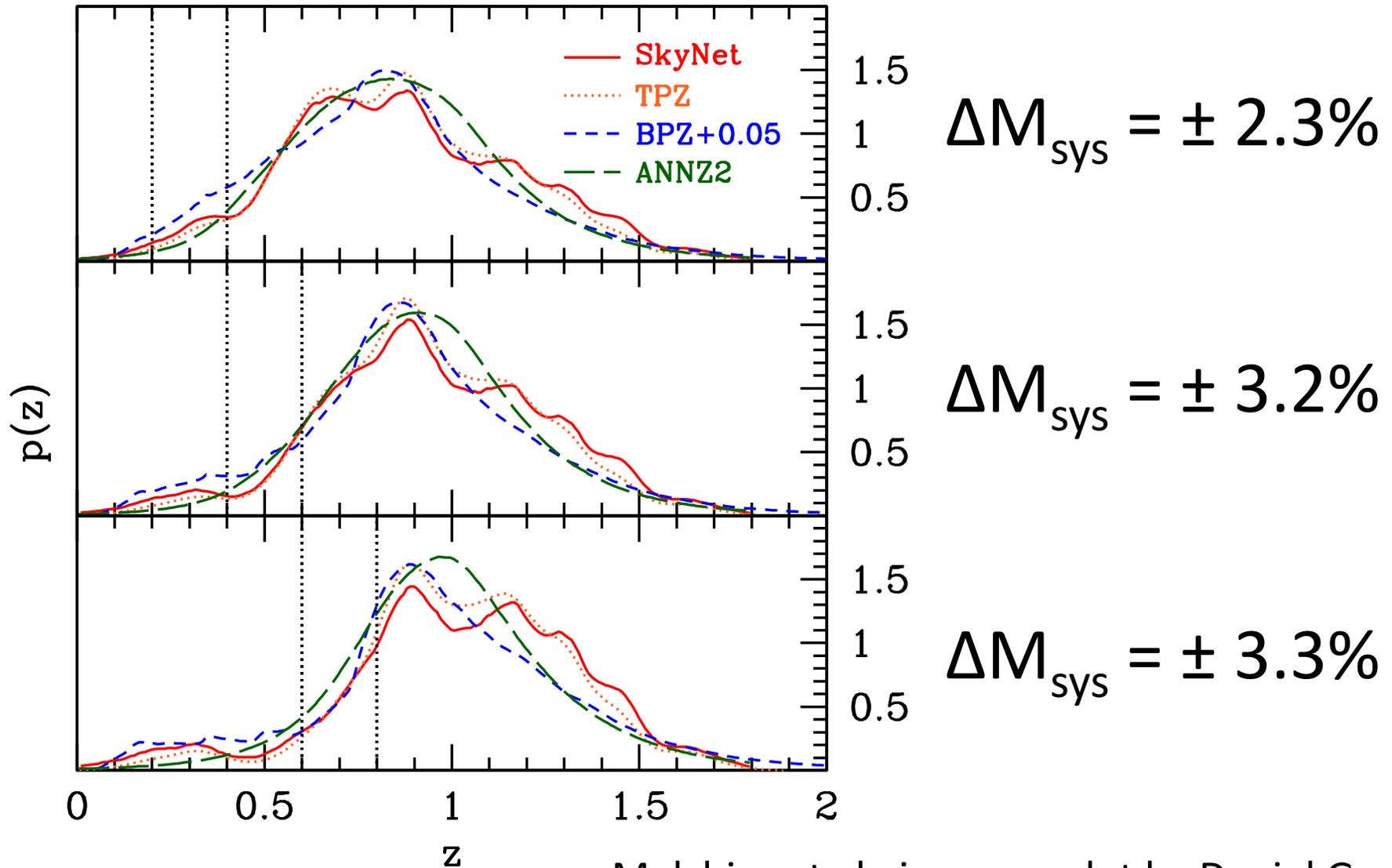
Problem: spectra don't exist!

~~**Solution:** use COSMOS 30 band photozs to test!~~

Solution:

- use multiple (a priori equally valid) methods.
- systematic error is mass range spanned by methods

Photoz Systematics



Melchior et al., in prep., plot by Daniel Gruen

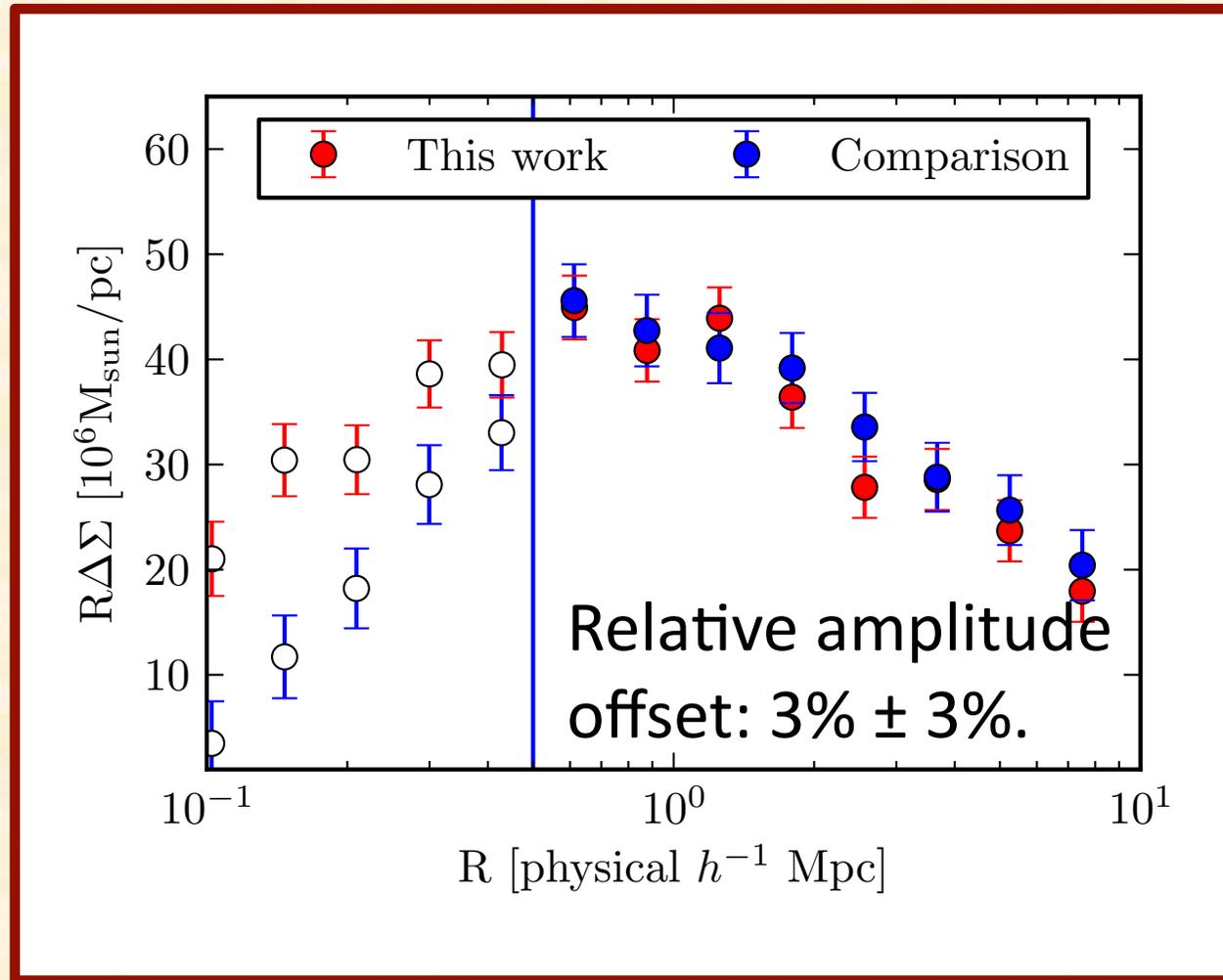
Systematics Require us to do Everything (at least) Twice

Two independent shape catalogs.

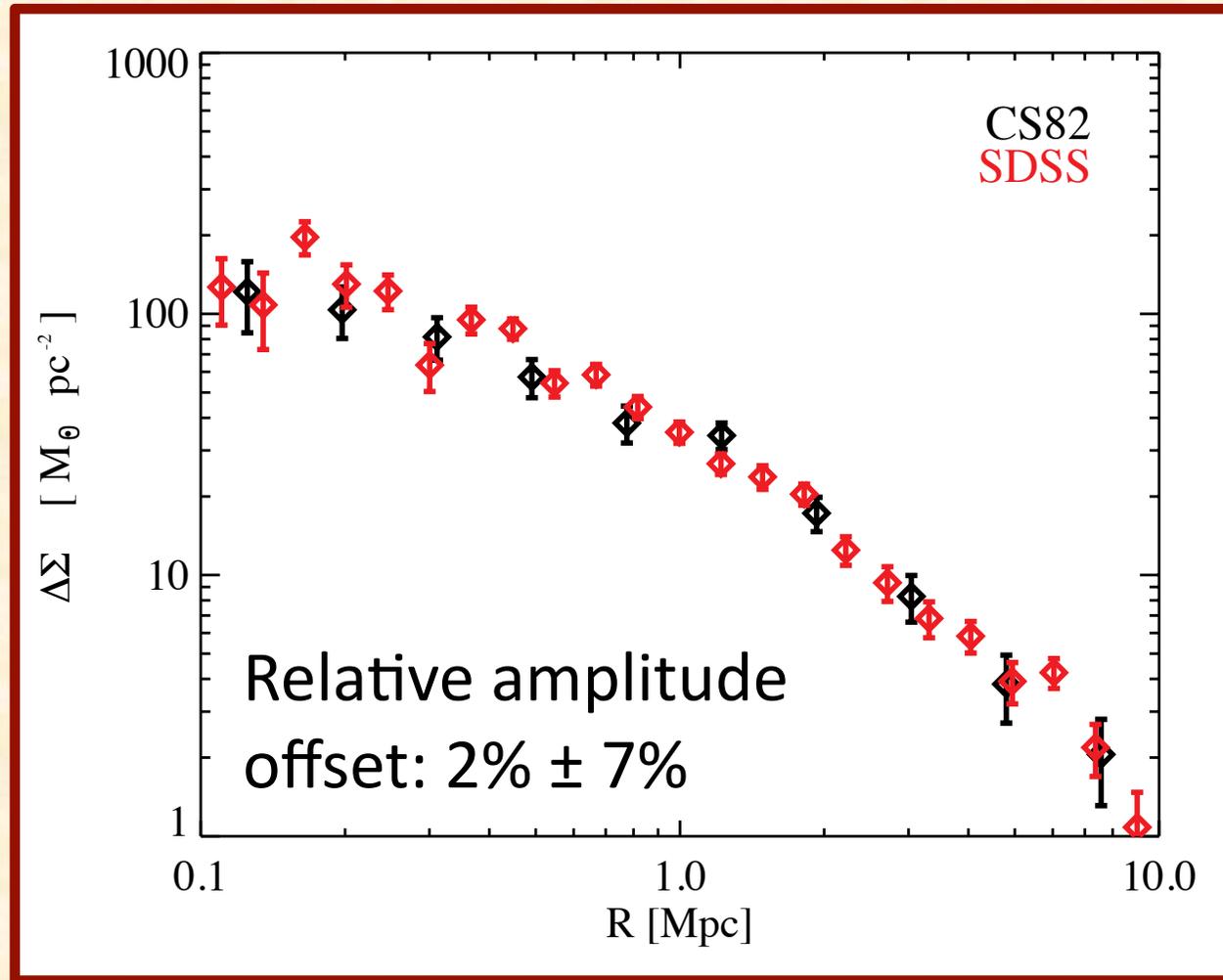
4 independent photoz catalogs.

Significant efforts have gone into characterizing the relative performance of each.

Equivalent Tests for SDSS

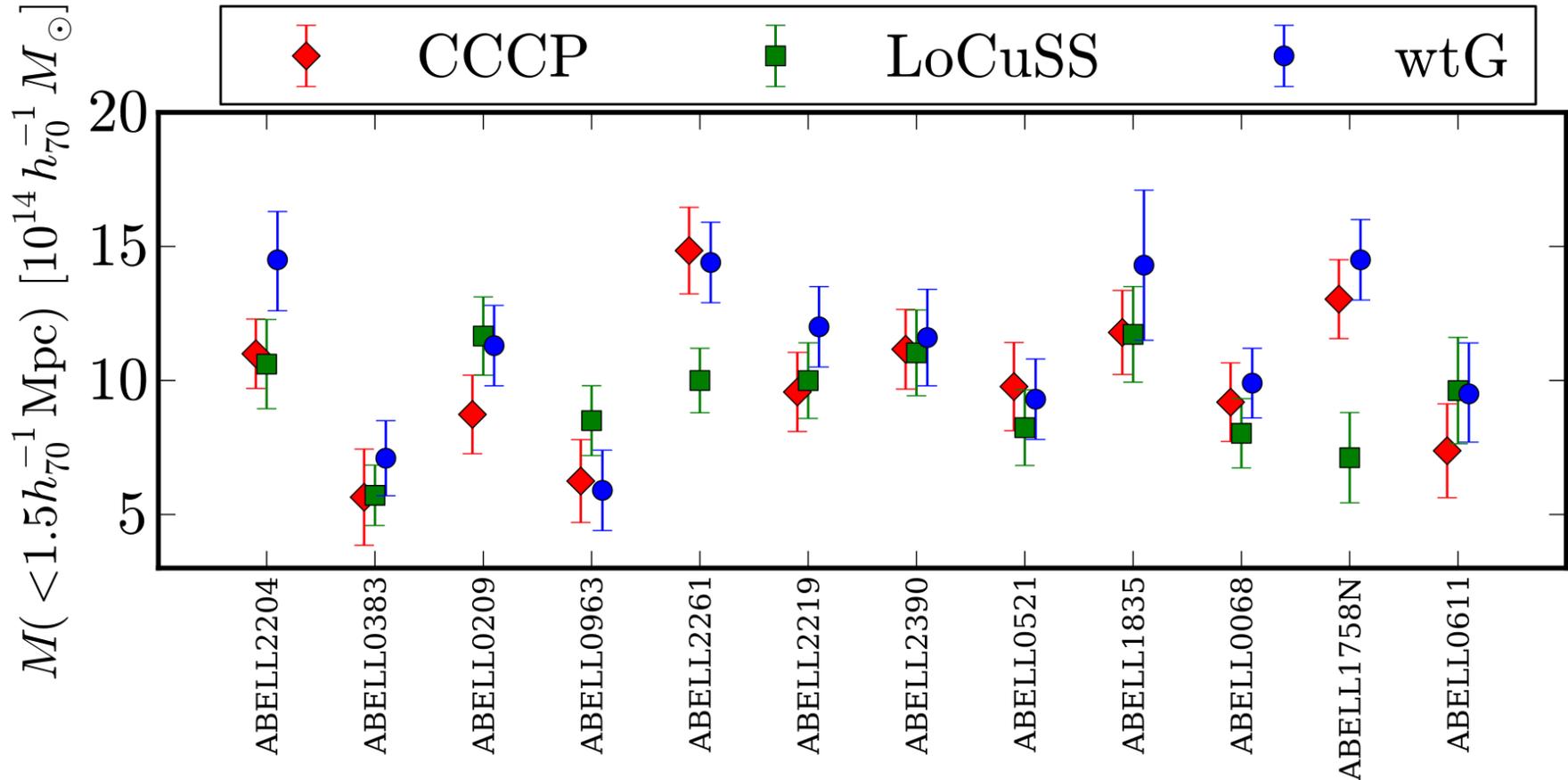


Equivalent Tests for SDSS



Plot by Alexie Leauthaud

Other Comparisons

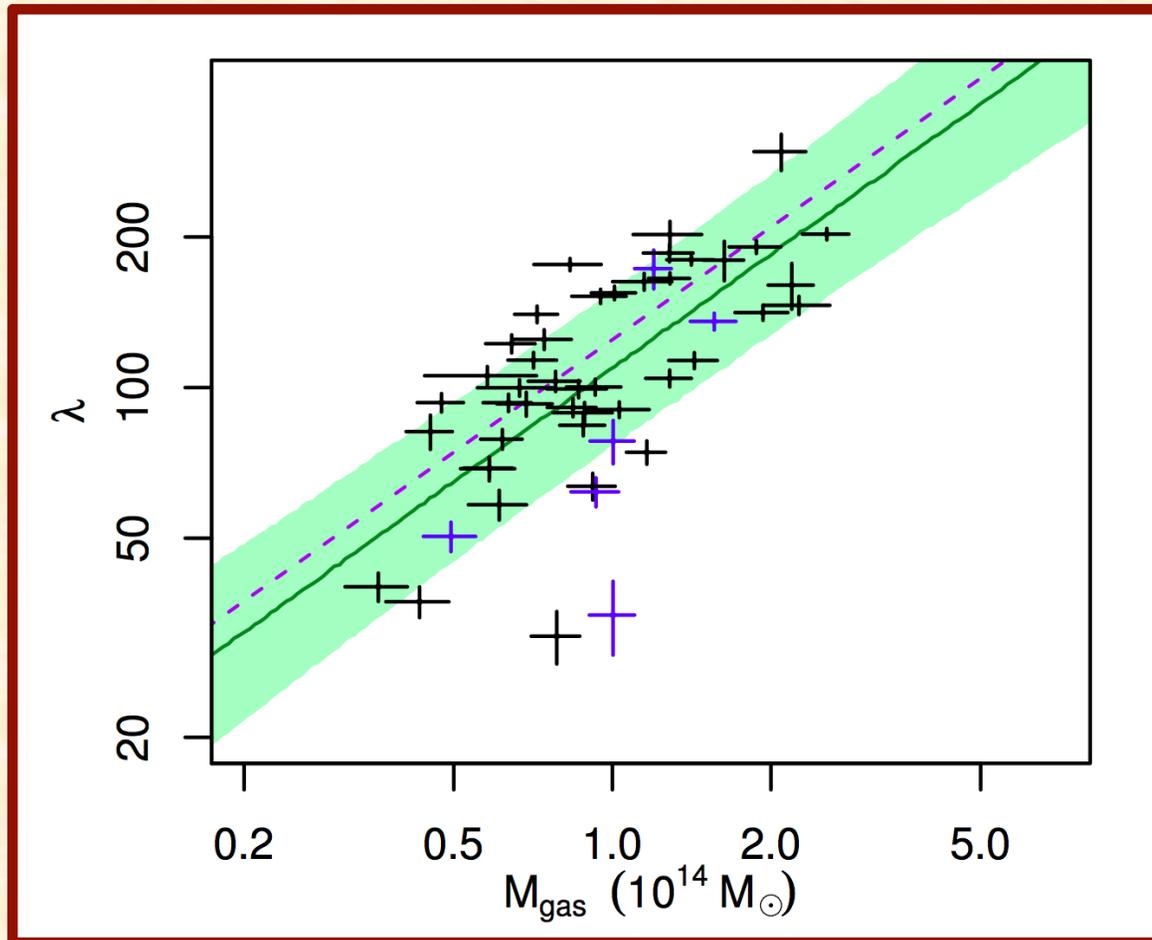


$$M_{\text{CCCP}}/M_{\text{LoCuSS}} : 1.04 \pm 0.07$$

$$M_{\text{wtG}}/M_{\text{LoCuSS}} : 1.18 \pm 0.08$$

$$M_{\text{wtG}}/M_{\text{CCCP}} : 1.13 \pm 0.08$$

redMaPPer—WtG



Prospects for Improvement

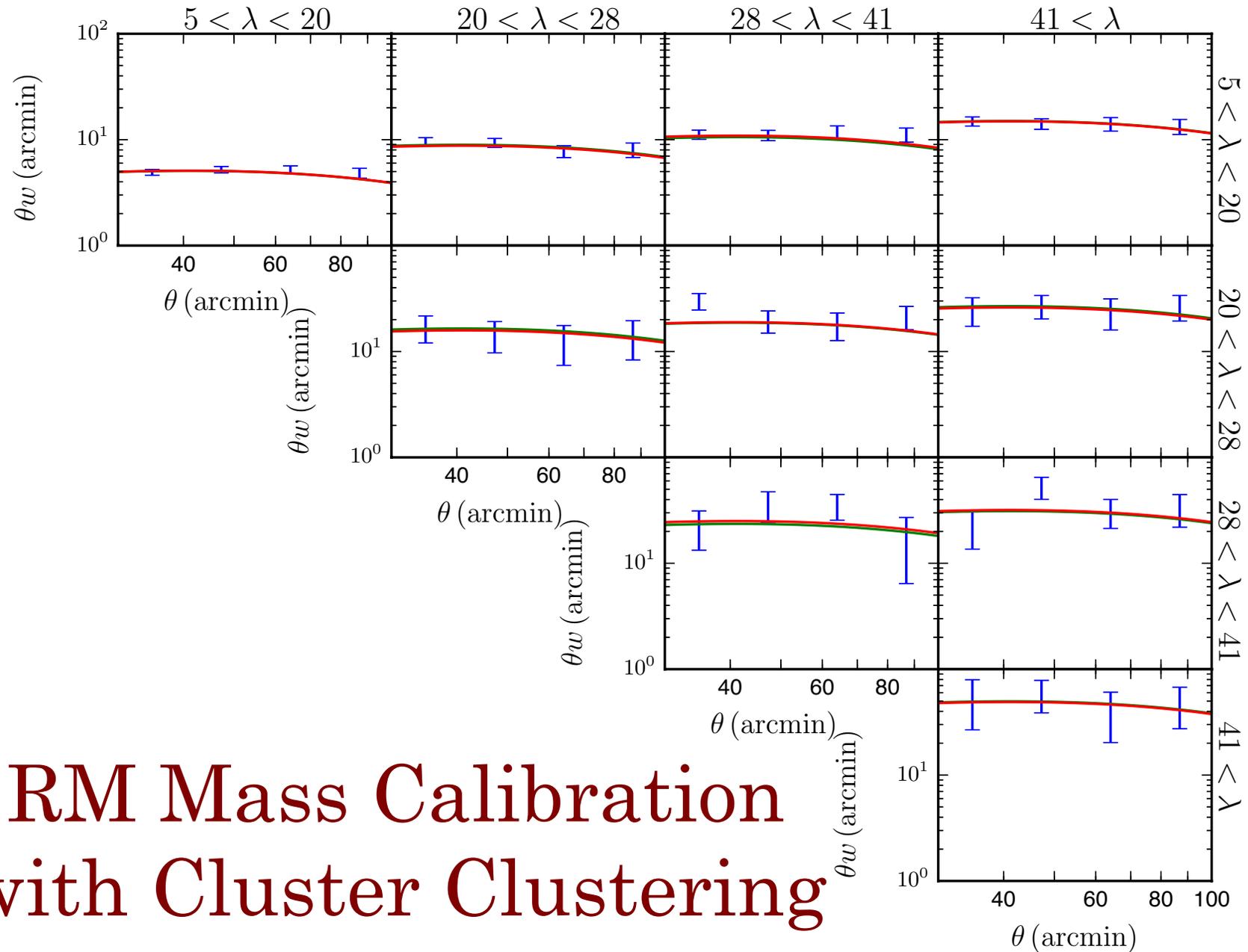
- Shape systematics:
 - New estimators (e.g. Bernstein & Armstrong 2014).
- Photoz systematics:
 - Spectroscopic campaigns.
 - cross-correlation methods.

Alternative mass calibration methods!

Alternatives

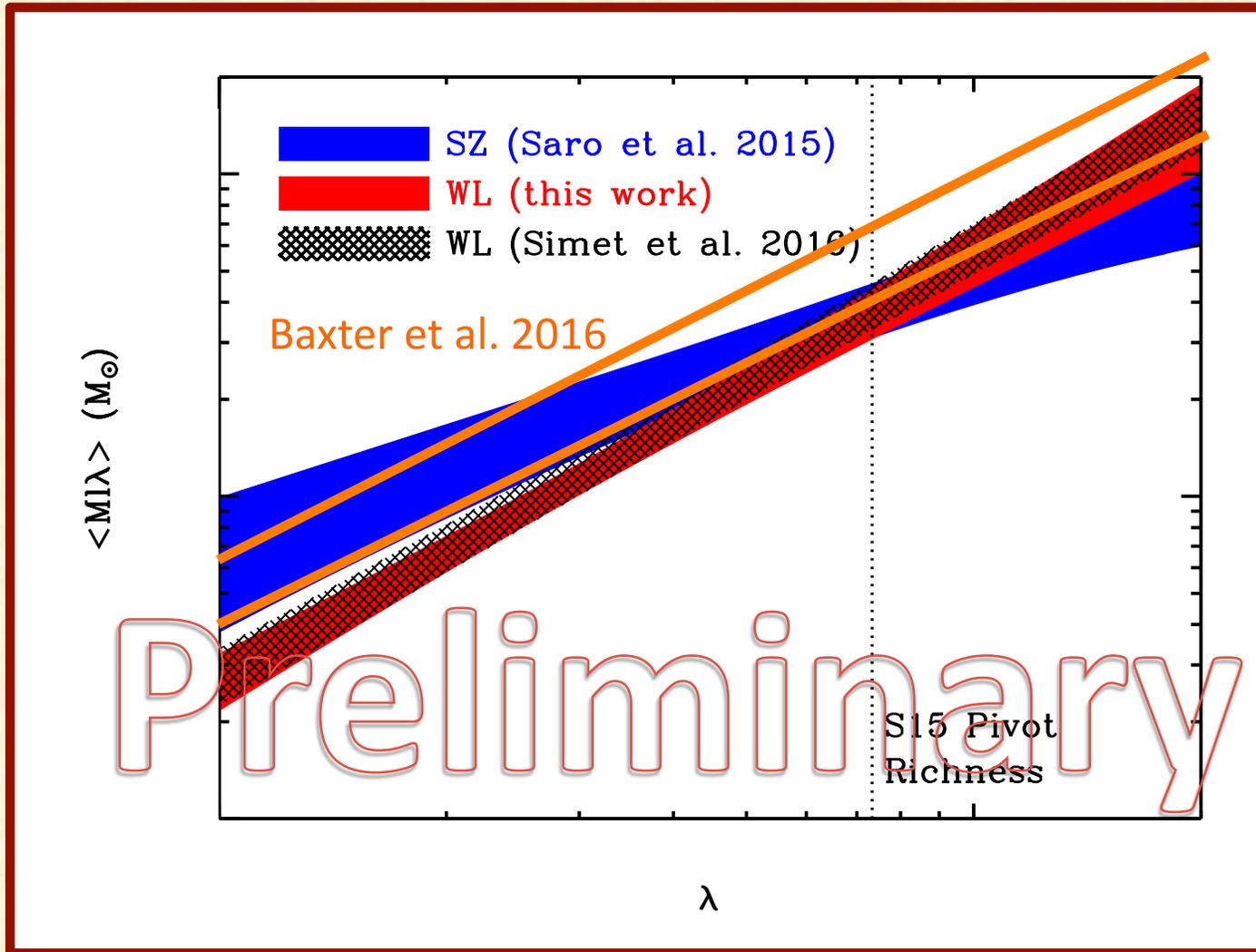
- X-ray/SZ
 - See following talk by Stefano Ettori.
- Cluster dynamics: (see talk by August Evrard)
 - Statistical precision is better than 2% (!).
 - Large systematic uncertainty: velocity bias.
- CMB lensing:
 - See talk by Jean Baptiste Melin.
- Cluster clustering

Baxter et al. 2016.



RM Mass Calibration
with Cluster Clustering

Comparison of DES and SDSS



Alternatives

- Cluster clustering
 - Statistical precision = 7% in SDSS.
 - Systematics dominated: 18% uncertainty from the calibration of the bias—mass relation.

Expect we can reach statistical limit in the not too distance future.

Summary

- Mass calibration is currently **systematics dominated**.
- WL is currently our best tool for mass calibration:
 - Shape systematics
 - Photoz systematics
- **Main take-away: we should estimate both shape and photozs in more than one way!**
- Multiple alternate methods are likely to become competitive in the near future.
 - CMB lensing
 - Cluster clustering