

# Constraining Dark Energy with Clusters of Galaxies

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#### Cluster sensitivity to cosmology

Models are normalized to produce same cluster abundance at low redshifts

For models with **larger w**:

- less volume --> less clusters at low redshift.
- structure grows less rapidly
   -> more clusters at high redshift.



Mohr, J. 2005

Cluster mass is not an observable. We must rely on observable proxies for mass, which have intrinsic scatter. For example:

 Sunyaev Zel'dovich (SZ): A1914 z=0.17 Inverse Compton scatter of CMB photons off cluster 52 gas (electrons) - No redshift dependence, 50 low scatter, but high M<sub>th</sub>  $(\sim 10^{14.2} h^{-1} M_{sun})$ 48 Carlstrom et al. 2002 37°46  $26^{m}0^{s}$ 45<sup>s</sup> 14<sup>h</sup>26<sup>m</sup>15<sup>s</sup> Cluster Abell 1914 1'

Cluster mass is not an observable. We must rely on observable proxies for mass, which have intrinsic scatter. For example:

**Optical/IR**: clustering of **galaxies** in physical and color space

- High-scatter, but lowest  $M_{th}$ (~10<sup>13.5</sup>-10<sup>14</sup> h<sup>-1</sup>  $M_{sun}$ ).





SDSS image

Cluster mass is not an observable. We must rely on observable proxies for mass, which have intrinsic scatter. For example:

# **X-ray**: thermal emission from hot cluster **gas**

– Many choices of observables. Temperature (from spectrum), luminosity, f<sub>gas</sub> .

– Assumes hydrostatic equilibrium. Lowest scatter, but risk of bias, depending on observable.

#### Cluster Abell 1914



Cluster mass is not an observable. We must rely on observable proxies for mass, which have intrinsic scatter. For example:

Weak Lensing: Directly probes (projected) total mass.

Low redshift. Requires stacking (does it? -> shear peaks)





Shear map from Dahle et al. 2002

#### Predicting cluster counts

The mean number of clusters with mass  $M > M_{th}$  is given by

$$\overline{m}(M > M_{th}, z) = \underbrace{\int dV \int_{M_{th}}^{\infty} d\ln M}_{d\ln M} \underbrace{\frac{dn}{d\ln M}}_{d\ln M}$$

Depends on geometry.

Mass Function (eg. Jenkins). Derived from power spectrum. Depends on cosmology through growth of structure.

Can get more information by **binning** in redshift and mass:

$$\overline{m}(M_{i}, z_{k}) = \int d\Omega \int_{z_{k}}^{z_{k+1}} dz \frac{D_{A}^{2}(z)}{H(z)} \int_{M_{i}}^{M_{i+1}} d\ln M \frac{dn}{d\ln M}$$

Things get more complicated when we include errors in redshift and mass, selection effects, and observational errors ...

#### Predicting cluster counts

The mean number of clusters in a bin of  $\vec{M}_{obs} = (M_{obs}, M_{obs}, ..., M_{obs}^n)$ and  $z_{phot}$  is



# Modeling $P(\vec{M_{obs}} | M)$

Simulations and observations suggest mass-observable errors are (mostly) well-represented by **log-normal** distributions:

$$P(M_{obs}^{i} \mid M) = \frac{1}{\sqrt{2\pi\sigma_{\ln M}^{2}}} \exp\left[-x^{2}(M_{obs}^{i}, M)\right]$$

where

$$x(M_{obs}^{i},M) = \frac{\ln M_{obs}^{i} - \ln M - \ln M_{bias}}{\sqrt{2\sigma_{\ln M}^{2}}}$$

 $\ln M_{bias} = \ln M_{bias}(M,z)$  $\sigma_{\ln M}^2 = \sigma_{\ln M}^2(M,z)$ 

#### **Cluster Counts**

**Cosmological** and **mass nuisance** parameters affect counts in similar ways:



### Noise in Counts

 Counts in an angular bin will deviate from the mean because of Poisson errors (shot noise) and large-scale clustering.

• If we can predict the **noise** given the cosmology and mass-nuisance parameters, then we can use the noise to improve constraints!

Using clustering information is one of the techniques referred to as self-calibration.

Lima & Hu (2004, 2005, 2007)

#### Predicting the Noise

The sample covariance of the counts due to clustering is

$$=\frac{b_i\overline{m_i}\ b_j\overline{m_j}}{V_i\ V_j}\int\frac{d^3k}{(2\pi)^3}W_i^*(k)W_j(k)P(k) \leftarrow$$

Theoretical **Prediction** 

i, j: Correspond to redshift bins.

Overbars correspond to spatial averages at fixed redshift bins.

### **Cross-Calibration**

### Parametrization of OPT + SZ

#### **Optical:**



Based on expected sensitivities of DES (optical) and SPT (SZ) surveys.

#### **Cross-Calibration**

#### Old:



#### New:



## Results



# Results

Priors on nuisance parameters will further improve constraints



A sample of ~100 clusters with detailed mass modeling is needed to achieve  $\sigma(\sigma_{InM}^2) \sim (0.1)^2$  at z~1.

Cunha (2009)

### Degeneracies

- A model for the cluster counts is a function of the **cosmological** and the **mass nuisance** parameters, which can be **degenerate**.
- Choice of parametrization affects results only up to a point.
- Dark energy effects on growth and geometry are very smooth, so only low-order evolution of systematics matters.
- If we can trust simulations and physical models for errors, much stronger constraints are possible.
- Simulations do not need to estimate parameters correctly, the cross-calibration can do that.

### Uncertainties in the mass function

### The mass function

Recall:

$$\overline{m}(M > M_{th}, z) = \int dV \int_{M_{th}}^{\infty} d\ln M \frac{dn}{d\ln M}$$
$$\frac{dn(M, z)}{dM} = f(\sigma) \frac{\overline{\rho}_m}{M} \frac{d\ln \sigma^{-1}}{dM}$$

Choice: Tinker mass function (Tinker et al. 2008)

$$f(\sigma) = A\left[\left(\frac{\sigma}{b}\right)^{-a} + 1\right]e^{-c/\sigma^2}$$

Parameters:
$$A(z) = A_0 (1+z)^{A_x}$$
 $A_0 = 0.186$  $A_x = -0.14$  $a(z) = a_0 (1+z)^{a_x}$  $a_0 = 1.47$  $a_x = -0.06$  $b(z) = b_0 (1+z)^{-\alpha}$  $b_0 = 2.57$  $\alpha = 0.0107$  $c = 1.19$  $c = 1.19$ 

### The galaxy bias

$$b(M;z) = 1 + \frac{a_c \delta_c^2 / \sigma^2 - 1}{\delta_c} + \frac{2p_c}{\delta_c \left[1 + (a_c \delta_c^2 / \sigma^2)^{p_c}\right]}$$

 $a_c = 0.75$  $\delta_c = 1.69$  $p_c = 0.30$ 

Bias is only needed to calculate clustering of clusters (self-calibration).

Sheth & Tormen (1999)

In total, we have 7+3 nuisance parameters for the massfunction and linear bias, and 6 nuisance parameters describing the mass-observable relation,  $P(M_{obs}|M)$ .

# Degradation in $\sigma(\Omega_{DE})$

SZ Survey

Baseline constraints (infinitely sharp priors):

$$\sigma(\Omega_{DE}) = 0.01$$
$$\sigma(w) = 0.05$$



#### Correlations (are complicated)



$$f(\sigma) = A\left[\left(\frac{\sigma}{b}\right)^{-a} + 1\right]e^{-c/\sigma^2}$$



$$\sigma_{\ln M}^2 = \sigma_0^2 + \sum_{i=1}^3 S_i z^i$$

 $\ln M_{bias} = B_0 + B_1 \ln(1+z)$ Cunha & Evrard
(2010)

# Very Complicated



#### Mass function nuisance parameters



Nuisance parameters describing redshift evolution of mass function only dominate when prior uncertainty is large (nearly flat priors).

Cunha & Evrard (2010)

# **Complementarity to other DE probes**

### The DETF figure of merit



Cunha, Huterer & Frieman (2009)

# Sensitivity to modifications of gravity

Fit to growth equation:

$$\ln g(a) = \int_0^a d\ln a \Big[\Omega_m^{\gamma} - 1\Big]$$

For General Relativity:

 $\gamma = 0.55$ 

$$\gamma FOM = \frac{1}{\sigma(\gamma)}$$

Fiducial: γ**FOM<sub>0</sub>=4.8** WL+SNIa+Planck+BAO

w/ Clusters: γ**FOM=10 - 50** WL+SNIa+Planck+BAO+Clusters



Cunha, Huterer & Frieman (2009)

# Primordial non-Gaussianity from Clusters

**Counts + Clustering of Clusters** is relatively insensitive to systematics – see Dragan Huterer's talk, Cunha et al (2010), Sartoris et al (2010), Oguri (2009).

#### **Clusters vs. Galaxies**

- Galaxy catalogs will be much bigger but,
- It's the large halo-halo separations that have the signal
- Clusters are more directly related to the haloes.

# Conclusions

- Cross-cal:
  - constrain mass-observable relations Applications
  - understand selection
  - test with simulations, real data

Future

• Better/more simulations to constrain mass function are **very desirable**. Simulations to understand massobservable relation are **essential** (and feasible).

• Interesting constraints are possible even with large uncertainties in sources of errors.

• Very interesting constraints if priors are available.

# **Cluster Research in Michigan**

- Gus Evrard
- Tim McKay
- Dragan Huterer
- Elena Rasia
- David Gerdes
- Chris Miller
- Jeff McMahon
- Oleg Gnedin
- Brian Nord
- Rebecca Stanek
- Anbo Chen
- Brandon Smith
- CC
- Jorg Dietrich

- Optical
- SZ
- X-Ray
- WL
- Simulations
- Observations
- Selection
- Contamination
- Mass-observable relation
- Substructure
- Photometric redshifts
- Cross-calibration
- Cosmological constraints

# Modeling $P(\vec{M_{obs}} | M)$

If all the P(M|M) are Gaussians, so is their product. For two massobservables the total probability  $P(M_{obs}|M)$  can expressed as a **bivariate lognormal** distribution.

$$P(\overrightarrow{M}_{obs} \mid M) = \frac{1}{\sqrt{2\pi|C|}} \exp\left[-x^T C^{-1} x\right]$$

Where *C* is the covariance matrix, defined as

$$C = \begin{pmatrix} \sigma_1^2 & \rho \sigma_1 \sigma_2 \\ \rho \sigma_1 \sigma_2 & \sigma_1^2 \end{pmatrix}$$

And  $\rho$  is the correlation coefficient (-1 <  $\rho$  < 1).

# **OPT+SZ** parameter space



0 < z < 1

33

# **OPT+SZ** parameter space



1 < z < 2

34

# Predicting cluster counts

#### Simplifying assumptions

• Work in range of  $M_{obs}$  and  $z_{phot}$  where selection is nearly complete:

$$\phi(\overrightarrow{M}_{obs}, z_{phot}) = 1$$

• Ignore observational errors:

$$P(\overrightarrow{M}_{obs}) = 1$$

•  $M_{obs}$  errors are separable from  $z_{phot}$  errors:

$$P(\overrightarrow{M}_{obs}, z_{phot} | M, z) = P(\overrightarrow{M}_{obs} | M) P(z_{phot} | z)$$

• Fixed  $\sigma(z_{phot})=0.02$  errors for this talk.

#### The importance of being clustered



#### Parametrization of OPT + SZ

**Optical:** 
$$\ln M_{bias} = \ln M_{bias}^{0} + a_1(1+z) + a_2(\ln M_{obs} - \ln M_{pivot})$$
  
 $\sigma_{\ln M}^2 = \sigma_0^2 + \sum_{i=1}^3 b_i z^i + \sum_{i=1}^3 c_i (\ln M_{obs} - \ln M_{pivot})^i$   
 $M_{th} = 10^{13.5} h^{-1} M_{sun}$   
 $0 < z < 1$   
 $\sigma_0^{fiducial} = 0.5$   
 $\ln M_{bias}^{fiducial} = 0$ 

SZ: 
$$\ln M_{bias} = \ln M_{bias}^{0} + a_1(1+z)$$
  
 $\sigma_{\ln M}^2 = \sigma_0^2 + \sum_{i=1}^3 b_i z^i$ 

 $\mathbf{0}$ 

Based on expected sensitivities of DES (optical) and SPT (SZ) surveys.