

Laboratório Interinstitucional de e-Astronomia (LineA)

# Constructing a pipeline to constrain cosmology with galaxy clusters

**LineA Webinar**

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Introduction  
Halo Abundance Formalism  
Observations of Galaxy Clusters  
Statistical Methods  
Observational Effects  
Simulation Results  
Science Portal  
Conclusions



## Introduction

Pipeline

Cosmology

Galaxy Clusters

Halo Abundance Formalism

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# Introduction

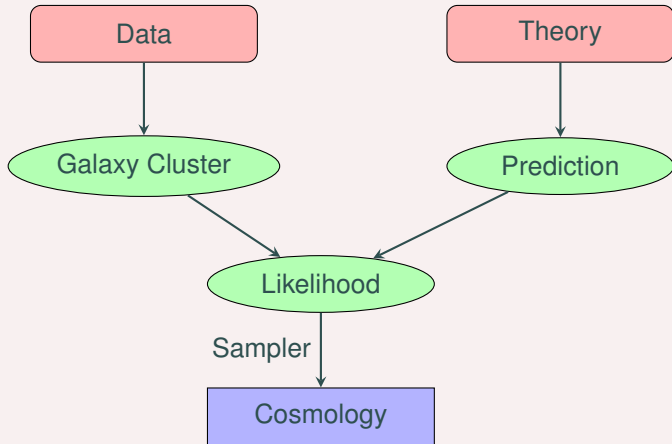
## Cosmological Surveys and Challenges



- ▶ The study of cosmology has experienced a rapid progress in the last few decades.
- ▶ Thanks to surveys such as WMAP (Hinshaw et al., 2013) & PLANCK (Planck Collaboration et al., 2016), the energy content of the Universe at the present epoch has been well characterized as:
  - ▶ dark energy ( $\sim 70\%$ )
  - ▶ dark matter ( $\sim 25\%$ )
  - ▶ baryonic matter ( $\sim 5\%$ )
- ▶ The modern approach relies on the use of large surveys using statistical quantities.
- ▶ Galaxy clusters are the largest structures in the Universe. The abundance is extremely sensitive to expansion and to growth of perturbations.



## Basic Idea





### Einstein Equation

$$G_{\mu\nu} - \Lambda g_{\mu\nu} = 8\pi G T_{\mu\nu}$$

### FRW Metric

$$ds^2 = dt^2 - a^2(t) [d\chi^2 + f^2(\chi)d\alpha^2]$$

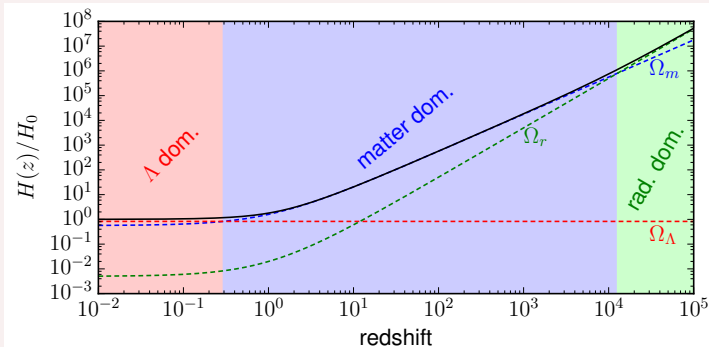
### Friedmann's equations

$$H^2(a) = \frac{8\pi G}{3} \bar{\rho}(a)$$
$$\frac{\ddot{a}}{a} = -\frac{4\pi G}{3} [\bar{\rho}(a) + 3\bar{P}(a)]$$



## Hubble Factor

$$H(z) = H_0 \sqrt{\Omega_\Lambda + \Omega_k(1+z)^2 + \Omega_m(1+z)^3 + \Omega_r(1+z)^4}$$

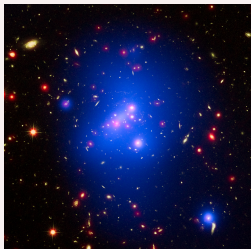


# Introduction

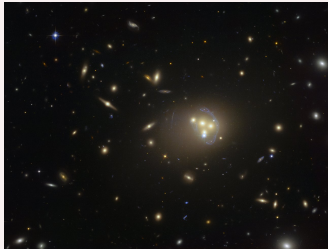
## Galaxy Clusters



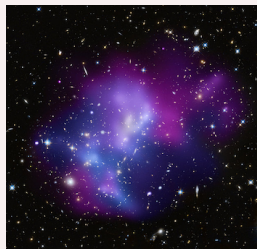
- ▶ Dark Matter Halos
- ▶ Galaxy Agglomeration
- ▶ Several Observational probes (Optical, X-Ray, SZ)



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Introduction

**Halo Abundance Formalism**

**Mass Functions**

Observations of Galaxy Clusters

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# Halo Abundance Formalism

Halo Mass-function



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## Fraction of Matter in Halos

$$F(M) = \frac{1}{\sqrt{2\pi}\sigma(M)} \int_{\delta_c}^{\infty} d\delta \exp\left[-\frac{\delta^2}{2\sigma^2(M)}\right] = \frac{1}{2} \operatorname{erfc}\left[\frac{\delta_c}{\sqrt{2}\sigma(M)}\right]$$

Press and Schechter (1974)

## The differential comoving mean halo number density

$$\frac{d\bar{n}}{d\ln M} = -\frac{\bar{\rho}_m}{M} \frac{dF}{d\ln M} = \frac{\bar{\rho}_m}{M} \frac{d\ln \sigma^{-1}}{d\ln M} \sqrt{\frac{2}{\pi}} \frac{\delta_c}{\sigma} \exp\left[-\frac{\delta_c^2}{2\sigma^2}\right]$$

$$\frac{d\bar{n}(z, M)}{d\ln M} = \frac{\bar{\rho}_m}{M} \frac{d\ln \sigma^{-1}}{d\ln M} f(\sigma)$$

# Halo Abundance Formalism

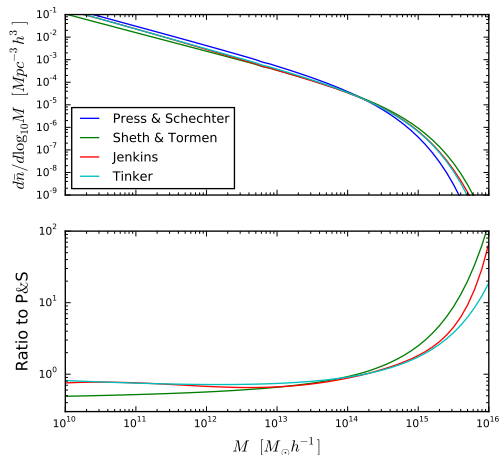
## Halo Mass-function



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### Mass-functions:

- ▶ Press and Schechter (1974) (Spherically)
- ▶ Sheth et al. (2001) (Ellipsoidal)
- ▶ Jenkins et al. (2001) (Simulation)
- ▶ Tinker et al. (2008) (Simulation)





Introduction

Halo Abundance Formalism

**Observations of Galaxy Clusters**

Object Finder

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## Techniques for Detecting Clusters

- ▶ **X - ray Observations** (Evrard et al., 1996; Vikhlinin et al., 2006; Clerc et al., 2016)
- ▶ **Sunyaev-Zel'dovich Effect** (Carlstrom et al., 2002)
- ▶ **Cluster Lensing** (Dietrich and Hartlap, 2010; Marian et al., 2012; Kacprzak et al., 2016; Peel et al., 2017)
- ▶ **Optical Clusters**

## Observational Effects

- ▶ Mass-Observable Relation (Lima and Hu, 2007)
- ▶ Completeness and Purity (Aguena and Lima, 2016)

$$\frac{d\bar{n}}{d \ln X} (\Theta_{cl}) = \int dV_{\Theta_h} \frac{d\bar{n}}{d \ln M} (\Theta_h) W_{[cl,h]}$$

# Observations of Galaxy Clusters

Object Finder



- ▶ Halo Finders
- ▶ Cluster Finders

## Approaches of Finders

- ▶ Friends of Friends
- ▶ Spherical Overdensity

## Optical Cluster Finders

- ▶ MaxBCG
- ▶ Farrens et al. (2011)
- ▶ VT3D (Abdalla et al. - in dev.)
- ▶ redMaPPer
- ▶ VT
- ▶ WaZp

# Observations of Galaxy Clusters

## Observational Effects



### Photometric Redshifts

$$\mathcal{P}(z^{\text{phot}}) = \int_0^{\infty} dz \mathcal{P}(z) P(z^{\text{phot}}|z)$$

### Mass-Observable Relation

$$\frac{d\bar{n}}{dM^{\text{obs}}} = \int_0^{\infty} dM \frac{d\bar{n}}{dM} P(M^{\text{obs}}|M)$$

### Selection Function

Completeness  $c(M, z)$  and Purity  $p(M^{\text{obs}}, z^{\text{phot}})$

### Corrected Prediction

$$\bar{m}_{\alpha,i} \equiv \Delta\Omega \int_{z_i^{\text{phot}}}^{z_{i+1}^{\text{phot}}} dz^{\text{phot}} \int dz \frac{D_A(z)^2}{H(z)} P(z^{\text{phot}}|z) \int_{M_{\alpha}^{\text{obs}}}^{M_{\alpha+1}^{\text{obs}}} dM^{\text{obs}} \int \frac{dM}{M} \frac{d\bar{n}}{d \ln M} P(M^{\text{obs}}|M) \frac{c(M, z)}{p(M^{\text{obs}}, z^{\text{phot}})}$$



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**Statistical Methods**

Likelihood

Fisher Matrix

MCMC sampling

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## Posterior

$$\mathcal{P}(\theta|\mathbf{O}) \propto \mathcal{L}(\mathbf{O}|\theta) \Pi(\theta)$$

## Gaussian Likelihood

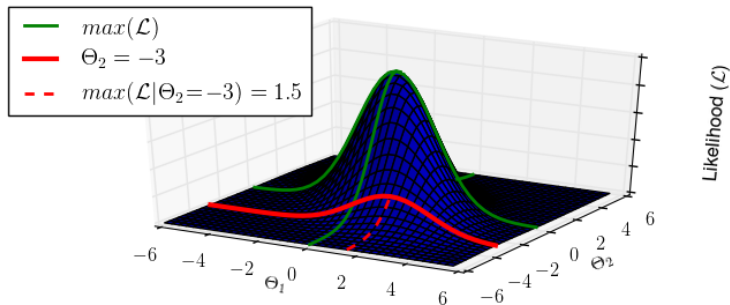
$$\mathcal{L} = \frac{1}{\sqrt{2\pi \det(\mathbf{C})}} \exp \left[ \sum_{ij} \frac{(N_i - \bar{m}_i) C_{ij}^{-1} (N_j - \bar{m}_j)}{2} \right]$$

## Poissonian Likelihood

$$\mathcal{L} = \sum_i \frac{N_i! \bar{m}_i^{N_i}}{\bar{m}_i}$$



$$\mathcal{L}(\Theta_1, \Theta_2) \propto \exp \left[ -\frac{\Theta_1^2 + \Theta_2^2 + \Theta_1\Theta_2}{5} \right]$$

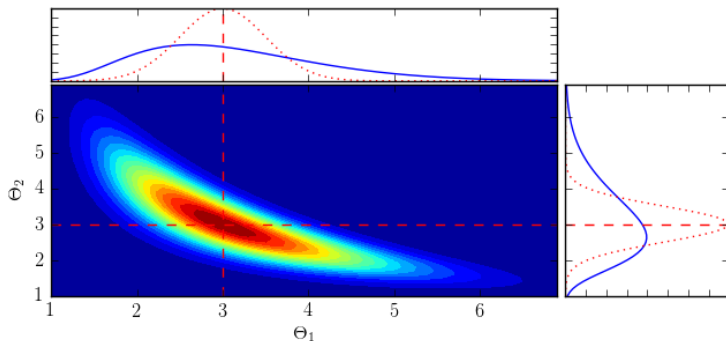


# Statistical Methods

## Likelihood - Marginalizing over Parameters



$$\mathcal{L}(\Theta_1, \Theta_2) \propto \exp \left[ -\frac{(\Theta_1 - 3)^2 + (\Theta_2 - 3)^2 + (\Theta_1 \Theta_2 - 9)^2}{5} \right]$$





- ▶ Assumes Gaussian distribution of the parameters
- ▶ Produces Forecasts
- ▶ Much Faster  $\mathcal{O}(N_{pars})$  than sampling techniques  $\mathcal{O}(10^4)$

$$F_{\alpha\beta} = - \left\langle \frac{\partial^2 \ln \mathcal{L}(\Theta)}{\partial \Theta_\alpha \partial \Theta_\beta} \right\rangle$$

## Likelihoods

$$F_{\alpha\beta} = \bar{\mathbf{m}}_{,\alpha} \mathbf{S}^{-1} \bar{\mathbf{m}}_{,\beta}^T + \frac{1}{2} \text{Tr} [\mathbf{S}^{-1} \mathbf{S}_{,\alpha} \mathbf{S}^{-1} \mathbf{S}_{,\beta}]$$

$$F_{\alpha\beta} = \bar{\mathbf{m}}_{,\alpha} \mathbf{M}^{-1} \bar{\mathbf{m}}_{,\beta}^T$$

$$F_{\alpha\beta} = \bar{\mathbf{m}}_{,\alpha} \mathbf{C}^{-1} \bar{\mathbf{m}}_{,\beta}^T + \frac{1}{2} \text{Tr} [\mathbf{C}^{-1} \mathbf{S}_{,\alpha} \mathbf{C}^{-1} \mathbf{S}_{,\beta}]$$



- ▶ Monte Carlo Markov Chain
- ▶ Sampling from probability distributions
- ▶ Much Faster  $\mathcal{O}(10^4)$  than grid  $\mathcal{O}(20^{N_{\text{pars}}})$
- ▶ Does not assume Gaussianity as FM

1. From a point  $\Theta$  in parameter space, propose a random step  $\Theta_s$ 
  - (a) If  $\mathcal{P}(\Theta_s) > \mathcal{P}(\Theta)$ : take the step ( $\Theta \rightarrow \Theta_s$ )
  - (b) Else: Generate a random number  $R \in [0 : 1]$ 
    - i. If the ratio  $\mathcal{P}(\Theta_s)/\mathcal{P}(\Theta) > R$ : take the step ( $\Theta \rightarrow \Theta_s$ )
    - ii. Else: Remain at the original point  $\Theta$
2. Repeat step 1 until the distribution of the parameters converge

- ▶ Usual formulation is not parallelizable
- ▶ Parallel implementation: `emcee` (Foreman-Mackey et al., 2013)



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# Theoretical Results

## Optical Effects on Cluster Dark Energy Constraints



How is the cluster cosmology affected by the optical effects?

- ▶ Aguena and Lima (2016)

## Survey

- ▶ flat  $w$ CDM with Planck 2015 cosmology ( $h^2\Omega_m, h^2\Omega_b, w, A_s, n_s, \Omega_{DE}$ )
- ▶ priors of 1% on ( $h^2\Omega_m, h^2\Omega_b, A_s, n_s$ )
- ▶ area of 5000 deg<sup>2</sup>, covariance within 500 cells of 10 deg<sup>2</sup>
- ▶  $0.1 \leq z \leq 1.0$
- ▶ 7 Mass bins:  $M_{th}^{obs} = 10^{13.8} M_{\odot} / h$ ,  $\Delta \log[M^{obs} / (M_{\odot} h^{-1})] = 0.2$
- ▶ Mass-Observable distribution Gaussian in log space:

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

# Theoretical Results

## Optical Effects on Cluster Dark Energy Constraints



### Mass-Observable

$$\ln M_{bias}^{obs}(z) = A_b + n_b \ln(1+z)$$

$$\frac{\sigma_{\ln M^{obs}}^2(z, M)}{0.2^2} = 1 + B_0 + B_z(1+z) + B_M \left( \frac{\ln M_s}{\ln M} \right)$$

$$*M_s = 10^{14.2} M_{\odot} / h$$

### Completeness and Purity

$$c(M, z) = \frac{[M/M_c(z)]^{n_c}}{[M/M_c(z)]^{n_c} + 1},$$

$$p(M^{obs}, z) = \frac{[M^{obs}/M_p^{obs}(z)]^{n_p}}{[M^{obs}/M_p^{obs}(z)]^{n_p} + 1}$$



# Theoretical Results

Optical Effects on Cluster Dark Energy Constraints

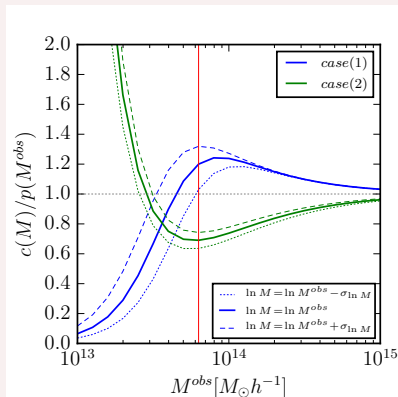
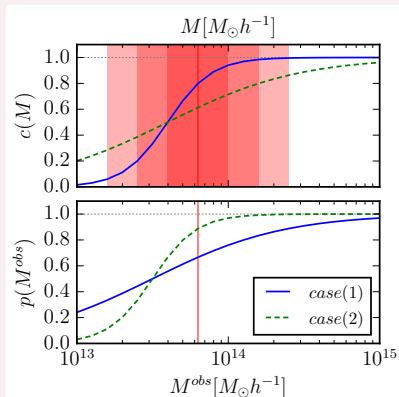


## Possibilities of Completeness and Purity

case (1):  $n_c = 3$ ,  $n_p = 1$

case (2):  $n_c = 1$ ,  $n_p = 3$

case (0):  $c(M) = 1$ ,  $p(M^{obs}) = 1$



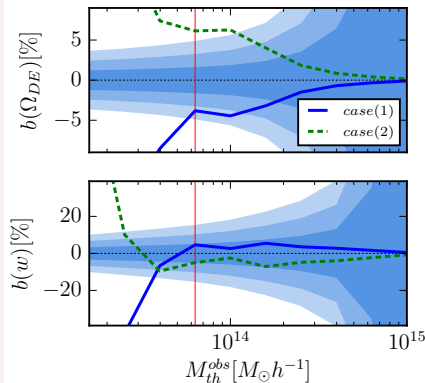


### Finding Bias Limit

- Bias inside the constraint:

$$b(\Theta_\alpha) \leq \gamma (F^{-1})_{\alpha\alpha}^{1/2}$$

where  $\gamma = 1, 2, 3$  indicate biased predictions inside the 68, 95, 99% confidence levels.



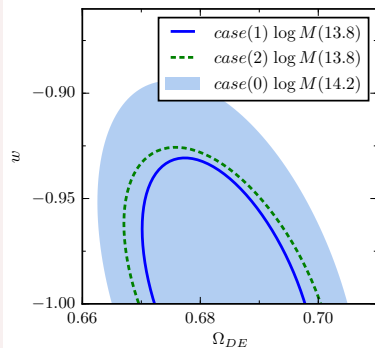
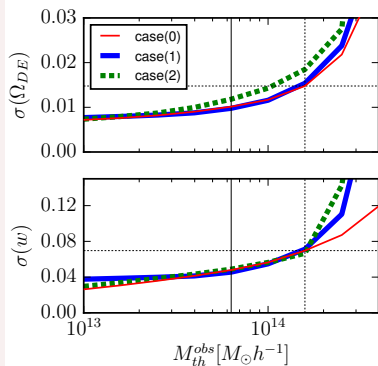
# Theoretical Results

Optical Effects on Cluster Dark Energy Constraints



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## Improvements by including $CP$ and Lowering $M_{th}$



# Theoretical Results

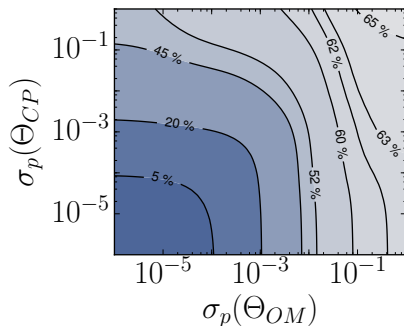
Optical Effects on Cluster Dark Energy Constraints



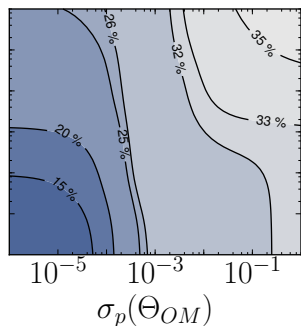
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$\Theta_{OM}$	$\Theta_{CP}$	$\sigma(\Omega_{DE})$	$\sigma(w)$
fix	fix	0.006	0.033
free	fix	0.009	0.044
fix	free	0.009	0.042
free	free	0.010	0.046

$\mathcal{D}_{\Omega_{DE}}[\sigma_p(\Theta_n)]$



$\mathcal{D}_w[\sigma_p(\Theta_n)]$





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**Simulation Results**

**BCC Dark Matter Halos**

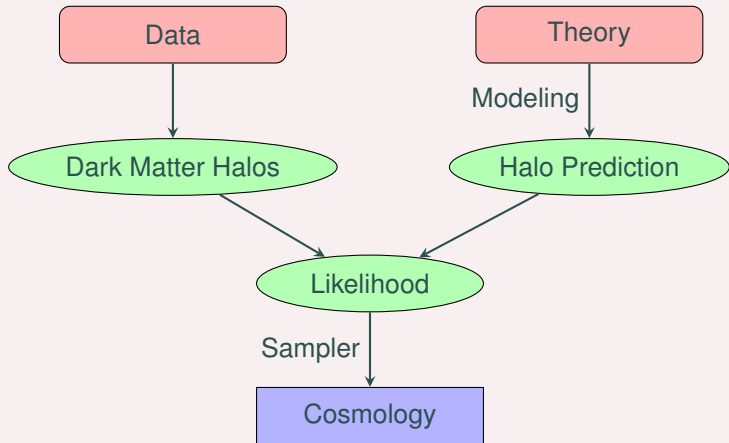
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## Halo Cosmology





## Simulation Specifications

- ▶ Aardvark v1.0 catalogs of the Blind Cosmology Challenge (BCC) - DES
- ▶ DM simulation ( $\sim 10,313 \text{ deg}^2$ ,  $0 < z < 2$ )
- ▶ DM halos (Behroozi et al., 2013, 2012) and galaxies
- ▶ Complete above  $\sim 4.5 \times 10^{13} M_{\odot} h^{-1}$  ( $\sim 5 \times 10^{12} M_{\odot} h^{-1}$ )
- ▶  $\sim 30$  million halos

## Theoretical Prediction Comparison

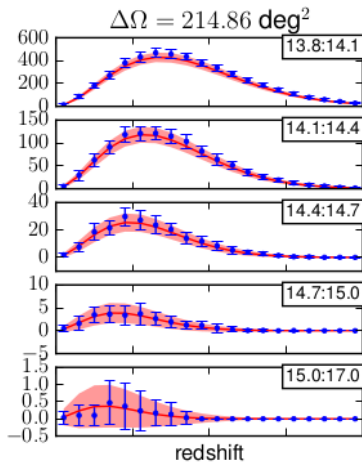
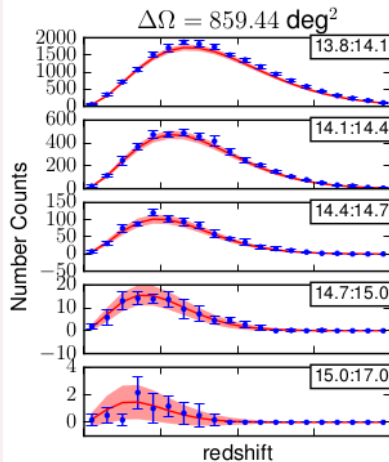
- ▶ 5 mass bins
- ▶ 20 redshift bins
- ▶ Survey was sub-divided into:
  - ▶ 12 pixels ( $859 \text{ deg}^2$ )
  - ▶ 48 pixels ( $214 \text{ deg}^2$ )
  - ▶ 768 pixels ( $13 \text{ deg}^2$ )
  - ▶ 49152 pixels ( $0.21 \text{ deg}^2$ )

# Simulation Results

BCC Dark Matter Halos



## Testing Theoretical Abundance Prediction





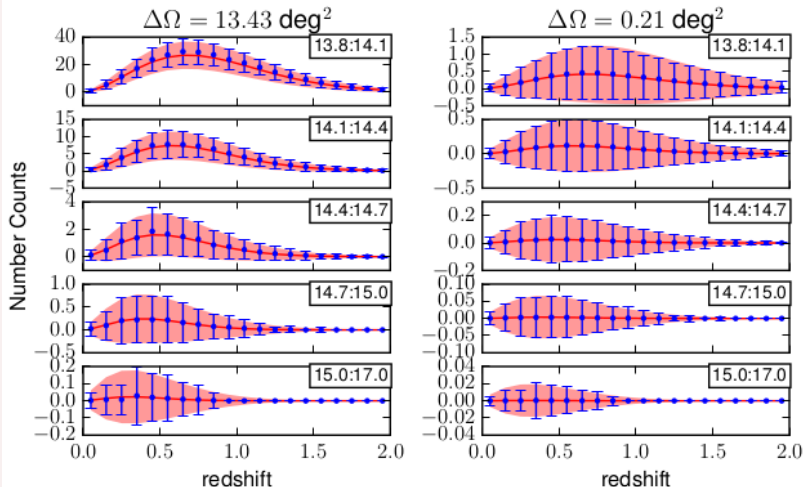
# Simulation Results

BCC Dark Matter Halos



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## Testing Theoretical Abundance Prediction



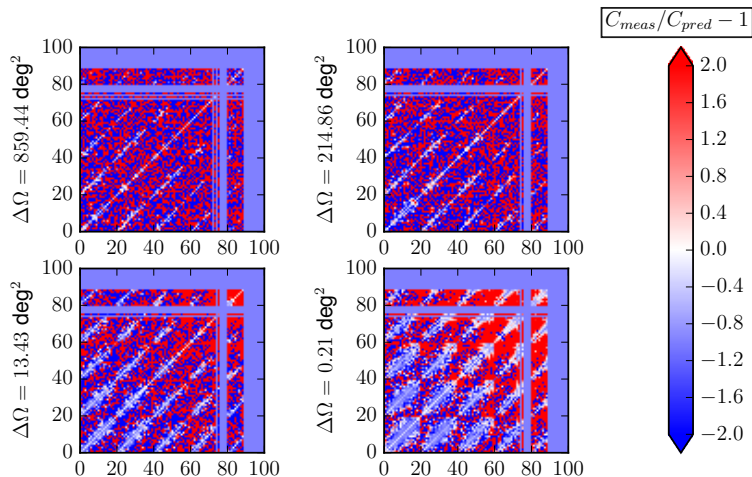
# Simulation Results

BCC Dark Matter Halos



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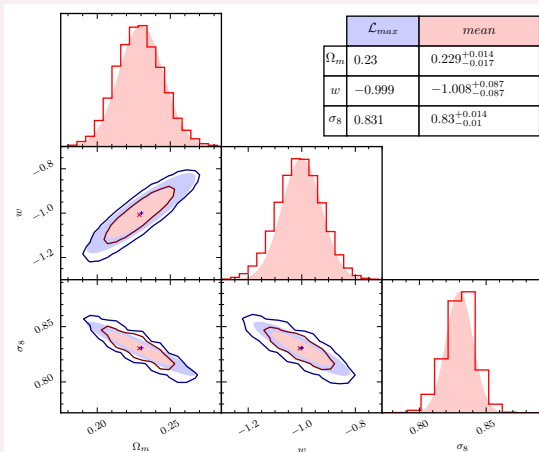
## Testing Theoretical Covariance Prediction





## Constraining Cosmology

- ▶ DM Halos
- ▶  $M_{th} = 10^{13.8} M_{\odot} h^{-1}$   
(5 bins)
- ▶  $0 < z < 2$  (20 bins)
- ▶ Tinker MF
- ▶ 214 deg<sup>2</sup>
- ▶  $(h, n_s, \Omega_b) =$   
(0.72, 0.96, 0.042)



# Simulation Results

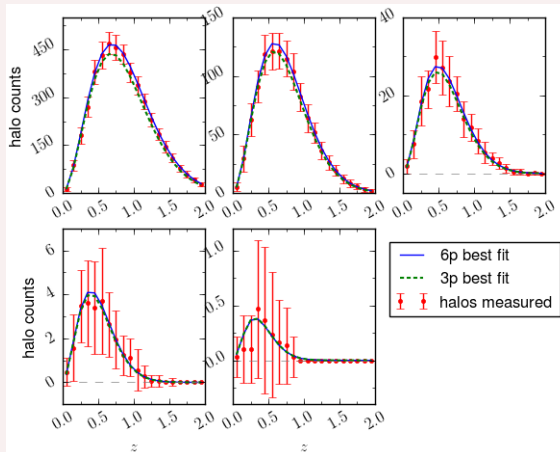
BCC Dark Matter Halos



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## Best fit

- ▶ DM Halos
- ▶  $M_{th} = 10^{13.8} M_{\odot} h^{-1}$   
(5 bins)
- ▶  $0 < z < 2$  (20 bins)
- ▶ Tinker MF
- ▶ 214 deg<sup>2</sup>





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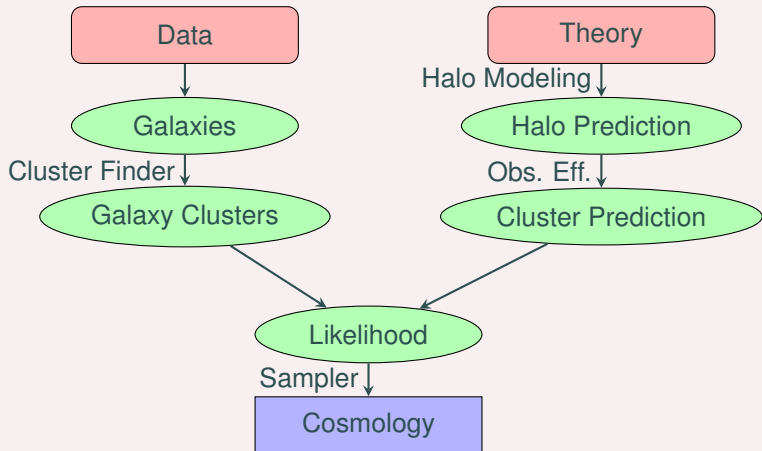
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## Cluster Cosmology



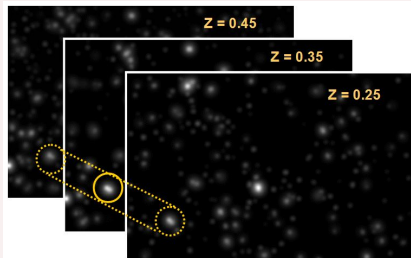
# Simulation Results

WaZp clusters in BCC

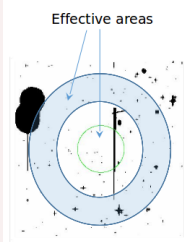


## WaZp

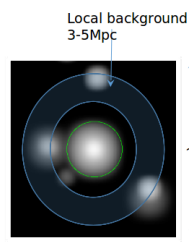
- ▶ Wavelet  $z$  Photometric (WaZp) *cluster finder* (Dietrich et al., 2014)
- ▶  $z^{\text{phot}}$  slices with overlaps
- ▶ Density in each slice is computed via wavelet transformation
- ▶ Cylinders across slices are constructed



A  $3 \text{ deg}^2$  tile



Masked regions



Galaxy density map

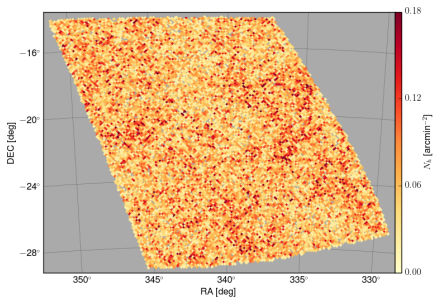
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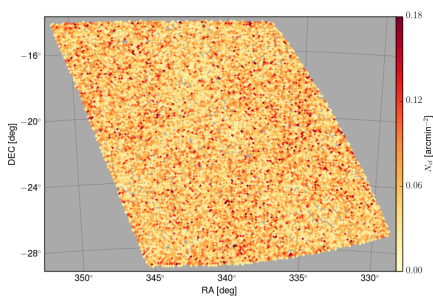


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- ▶ Reduced Area ( $\sim 220 \text{ deg}^2$ ),  $0.1 < z < 1.0$
- ▶ 45,677 Halos with  $M > 10^{13} M_{\odot} h^{-1}$
- ▶ 39,861 Clusters with  $N > 3$



Halos



Clusters



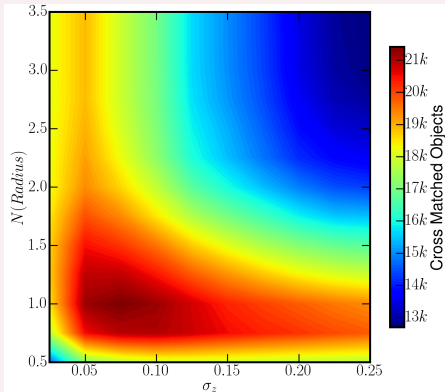


## Proximity Match

► Requirements:

$$\begin{cases} |z_{halo} - z_{cluster}| \leq \sigma_z (1 + z) * \\ \Delta\theta \leq N\theta_R \end{cases}$$

\* Ilbert et al. (2006); Mazure et al. (2007); Arnouts et al. (2007); Ilbert et al. (2009)



# Simulation Results

Wazp clusters in BCC

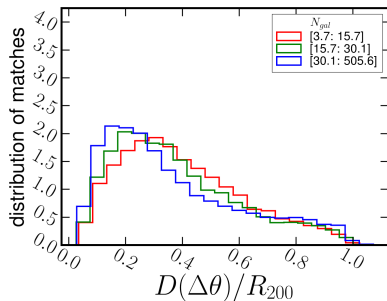
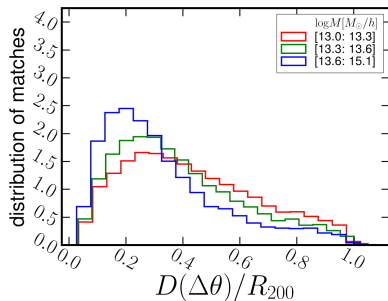


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## Angular Residuals

$$\Delta\theta \leq N\theta_R = 2N \arcsin\left(\frac{R}{2D(z_m)}\right)$$

## Mass/Richness Bins



# Simulation Results

Wazp clusters in BCC

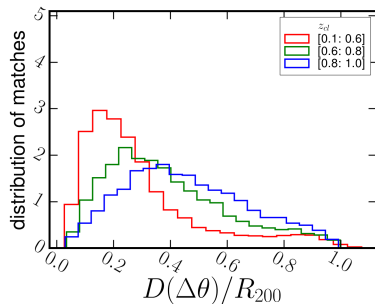
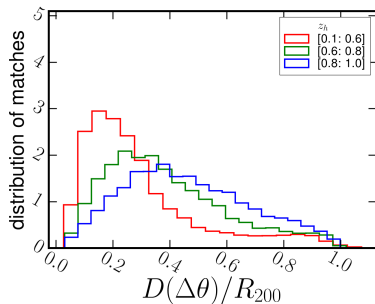


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## Angular Residuals

$$\Delta\theta \leq N\theta_R = 2N \arcsin\left(\frac{R}{2D(z_m)}\right)$$

## Redshift Bins

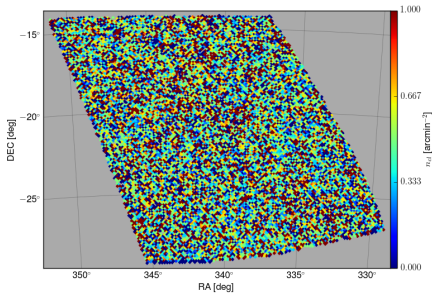


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Wazp clusters in BCC

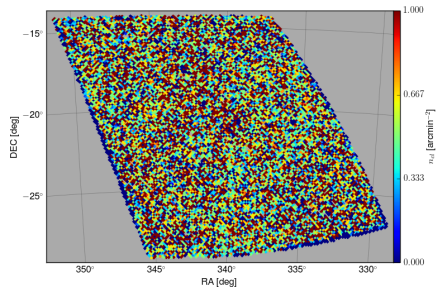


## Completeness and Purity - Regions in the Sky



Completeness

- ▶ No significant directional effects
- ▶ Small edge effects



Purity

# Simulation Results

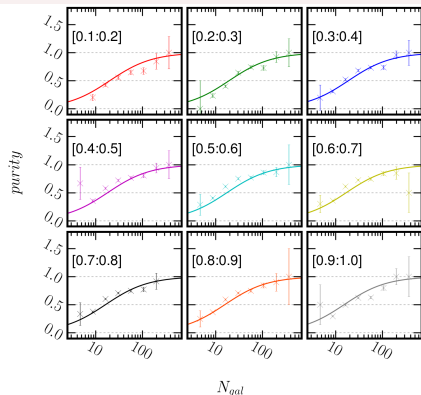
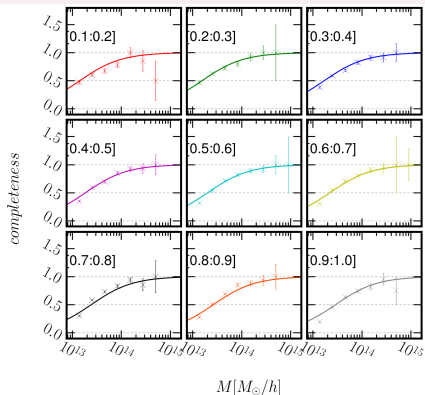
WAZp clusters in BCC



## Completeness and Purity - Fit Functional Form

$$c(z, M) = \frac{[M/M_c(z)]^{n_c}}{[M/M_c(z)]^{n_c} + 1}$$

$$p(M^{\text{obs}}, z^{\text{obs}}) = \frac{[M^{\text{obs}}/M_p^{\text{obs}}(z^{\text{obs}})]^{n_p}}{[M^{\text{obs}}/M_p^{\text{obs}}(z^{\text{obs}})]^{n_p} + 1}$$

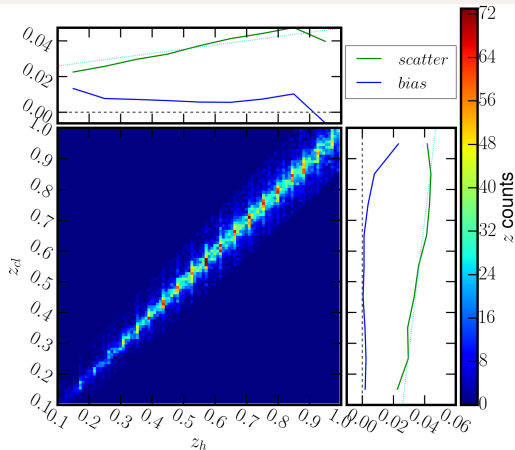


# Simulation Results

WaZp clusters in BCC



## Redshift Relation



- ▶ Scatter is very small
- ▶ Test showed including  $P(z^{obs}|z)$  had insignificant effect
- ▶  $P(z^{obs}|z)$  will not be considered

# Simulation Results

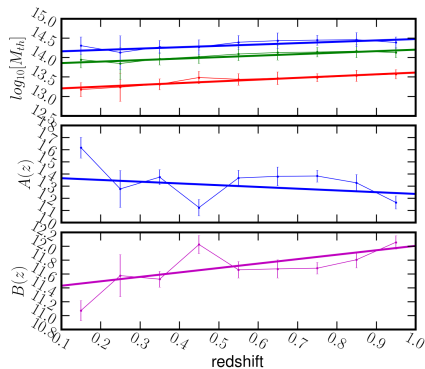
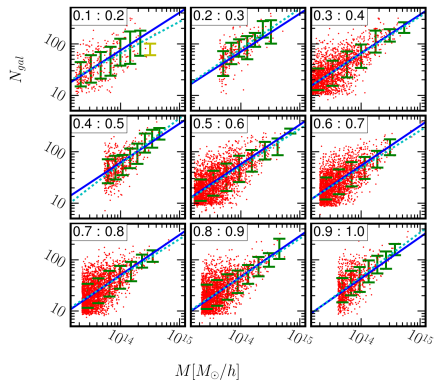
Wazp clusters in BCC



## Mass Richness Relation

$$\log \left[ \frac{M^{\text{obs}}(M^{\text{cl}}, z)}{M_{\odot} h^{-1}} \right] = A(z) \log [M^{\text{cl}}] + B(z)$$

$$\begin{cases} A(z) = A_0 + A_1 (1 + z) \\ B(z) = B_0 + B_1 (1 + z) \end{cases}$$



# Simulation Results

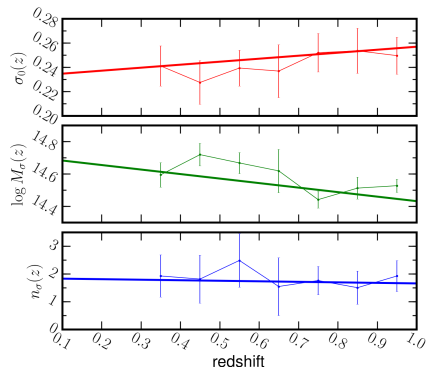
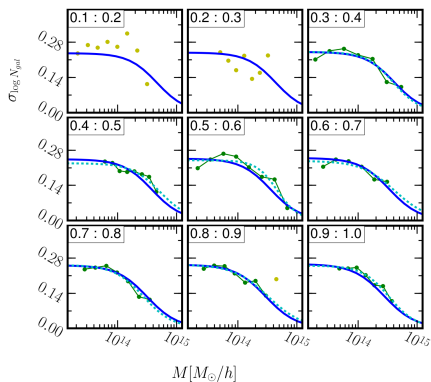
Wazp clusters in BCC



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$$\sigma_{\ln M_{cl}}(M, z) = \frac{\sigma_0(z)}{1 + \left(\frac{M}{M_\sigma(z)}\right)^{n_\sigma(z)}}$$

$$\begin{cases} \sigma_0(z) = \sigma_{00} + \sigma_{01}(1+z) \\ \log M_\sigma(z) = \log M_{\sigma 0} + \log M_{\sigma 1}(1+z) \\ n_\sigma(z) = n_{\sigma 0} + n_{\sigma 1}(1+z) \end{cases}$$





# Simulation Results

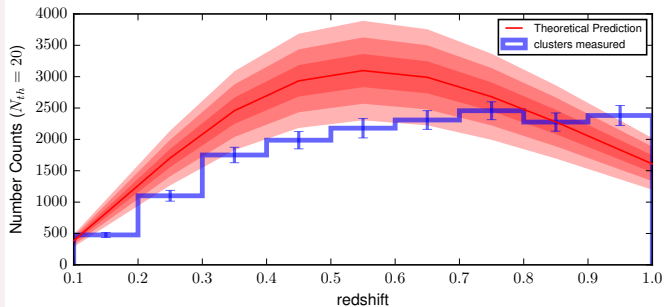
WaZp clusters in BCC



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## Theoretical Prediction

$$\bar{m}_{\alpha,i} \equiv \Delta\Omega \int_{z_i}^{z_{i+1}} dz \frac{D_A(z)^2}{H(z)} \int_{M_{\alpha}^{\text{obs}}}^{M_{\alpha+1}^{\text{obs}}} dM^{\text{obs}}$$
$$\int \frac{dM}{M} \frac{d\bar{n}}{d\ln M} P(M^{\text{obs}}|M) \frac{c(M, z)}{p(M^{\text{obs}}, z^{\text{phot}})}$$



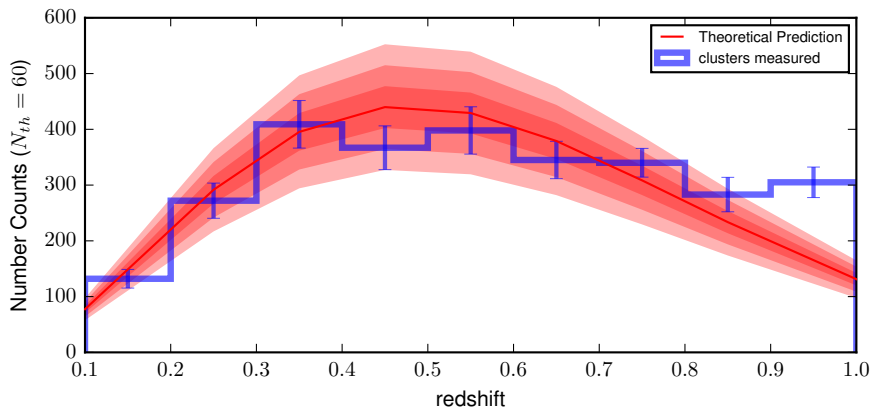
# Simulation Results

Wazp clusters in BCC



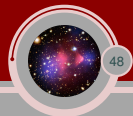
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## Theoretical Prediction



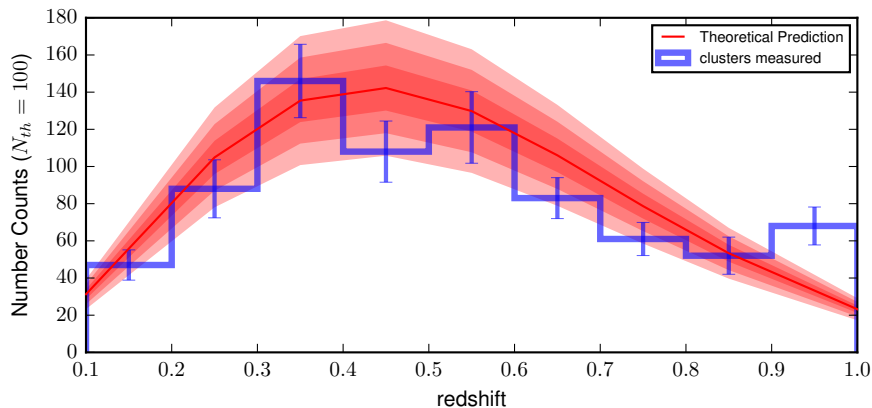
# Simulation Results

Wazp clusters in BCC



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## Theoretical Prediction



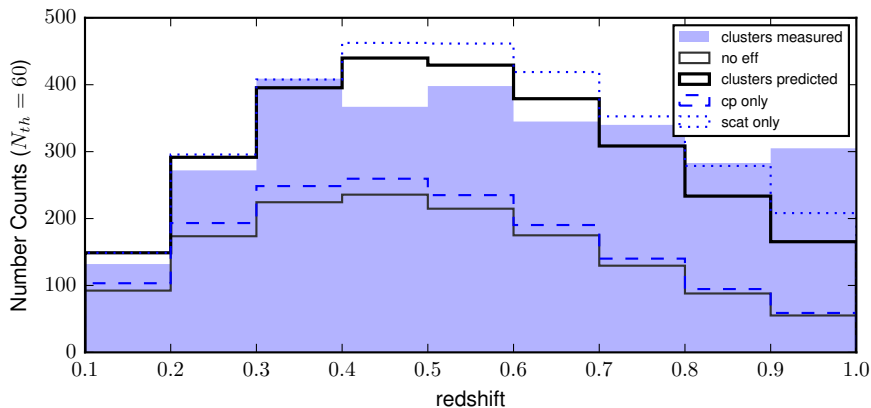
# Simulation Results

Wazp clusters in BCC



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## Theoretical Prediction





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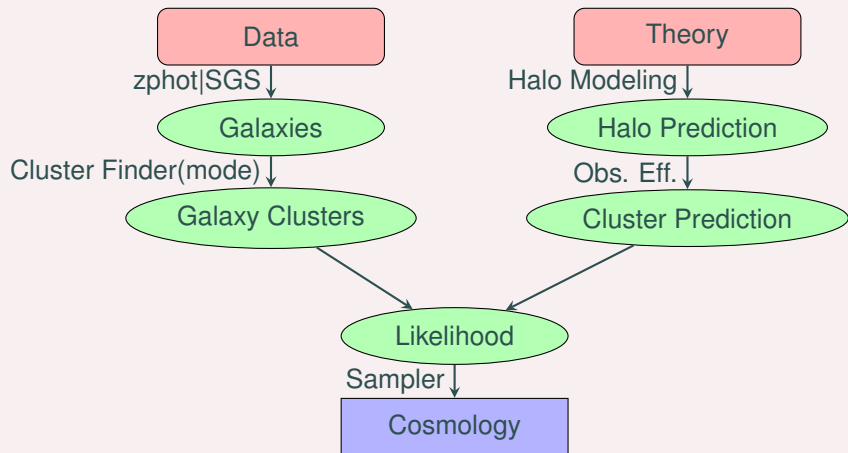
Simulation Results

**Science Portal**

Conclusions



- ▶ There are many additional issues for galaxy cluster detection
- ▶ Collaboration from researchers of different institutes/locations





## Pipelines

The screenshot shows the 'Pipelines' menu in the Science Portal. The menu items are: Data Installation, Data Preparation, Science-Ready Catalogs, Science Analysis, Parameter Estimation, Utilities, Special Samples, Examples, LSS, Cluster, SN, WL, Simulation, Galaxy Archeology, Galaxy Evolution, QSO, Strong Lensing, and Combined Probes. The 'Cluster' item is highlighted, and its sub-menu is open, showing: Cluster Finder, WAZP, Protoclusters Dropouts, Cluster Cosmology, WAZP results analysis, and Cluster Comparison.

The screenshot shows the 'Pipelines' menu in the Science Portal. The menu items are: Data Installation, Data Preparation, Science-Ready Catalogs, Science Analysis, Parameter Estimation, Utilities, Special Samples, Examples, creation of Value-Added Catalogs (VACs) and for Science Analysis results, Catalog Comparison, Cluster-Cluster Matching, Cluster-Halo Matching, Concatenate Fields, Download Tool, Download Tool, Product Register, Density Systematic Relation, and Foreground mask creator (Individual). The 'Cluster-Cluster Matching' item is highlighted, and its sub-menu is open, showing: Cluster-Cluster Matching, Cluster-Halo Matching, Concatenate Fields, Download Tool, Download Tool, Product Register, Density Systematic Relation, and Foreground mask creator (Individual). The URL [helpdesk@linea.gov.br](mailto:helpdesk@linea.gov.br) is visible in the sub-menu.



## Product Log - Matching

### Utilities Cluster-Cluster Matching

Process ID: 1874

Process Summary
Results
Comments

Summary
Properties
Completeness and Purity
Centering and Redshift
Most Massive Matches

Info
Catalogs Distribution
Matched (Two Way) Distribution
Matched (Including Multiple) Distribution
Unmatched (Two Way) Distribution
Unmatched (Including Multiple) Distribution
Products

**Quick Navigation**

- [Matching](#)
- [Footprints](#)
- [External Footprints](#)
- [Multiplicity](#)
- [Most massive](#)

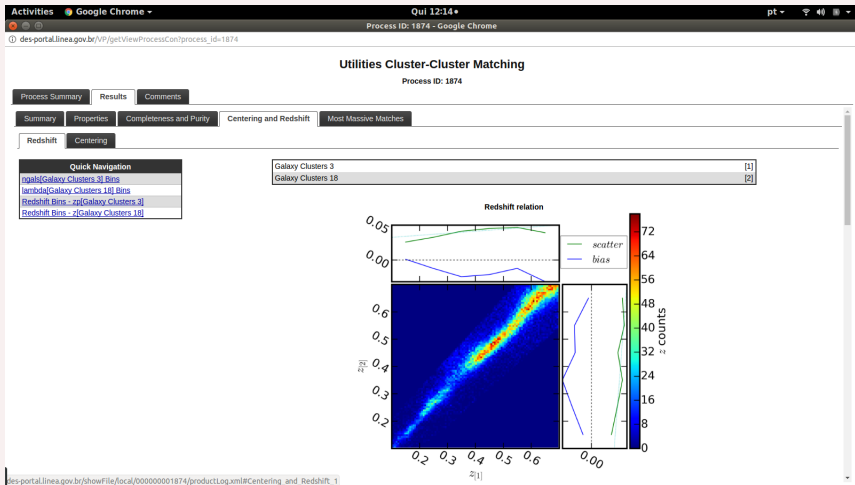
Matching		
Component Version	V02_19_00	
Matching Code Version	2.10.0	
Main Info		
	Galaxy Clusters 3	Galaxy Clusters 18
Index Label	[1]	[2]
Total Number of Objects Used	81805	85955
Match (including Multiple)	53487	48557
Two Way Match	45194	45194
Specific Matching Types		
	Galaxy Clusters 3	Galaxy Clusters 18
Match (Galaxy Clusters 18 -> Galaxy Clusters 3)	46090	46090
Match (Galaxy Clusters 18 -> Galaxy Clusters 3)(including Multiple)	52905	48050
Match (Galaxy Clusters 3 -> Galaxy Clusters 18)	46024	46024
Match (Galaxy Clusters 3 -> Galaxy Clusters 18)(including Multiple)	52063	47992
Footprints		
	Galaxy Clusters 3	Galaxy Clusters 18
Original Number of Objects in Each Catalog	140699	232400
Objects Cropped by limits	26484	128977
Objects Cropped by Galaxy Clusters 18 Footprint	32596	0
Objects Cropped by Galaxy Clusters 3 Footprint	14	17468
Footprint NSIDE	512 (~ 6.9 arcmin) - External Used [4096 (~ 51.5 arcsec)]	512 (~ 6.9 arcmin)
Footprint area	938.58 deg2 - External Used [1469.16 deg2]	951.16 deg2

[ses-portal.linea.gov.br/showFile/focal/000000001874/productLog.xml#tabAnalysis-2](http://ses-portal.linea.gov.br/showFile/focal/000000001874/productLog.xml#tabAnalysis-2)





## Product Log - Matching



des-portal.linea.gov.br/showFile/local/000000001874/productLog.xml#Centering\_and\_Redshift\_1



## Dashboard

DES Science Portal Dashboard

Release: Y1A1    Dataset: SPT

Data Installation					
Pipeline	Start	Duration	Runs	Status	
QA Coadd	2016-08-24 15:11:57	02:13:45	1	●	
Install Catalogs	2016-03-08 15:40:13	01:51:56	1	●	
Install Mangle Mask	2016-06-10 10:21:14	05:49:15	1	●	
Install Bright Mask	2016-06-10 10:15:36	00:01:07	2	●	
Install Depth Maps	2016-09-20 15:46:18	01:09:07	2	●	
Systematic Maps	2016-06-13 12:47:35	12:43:31	2	●	
Zeropoint Correction	2017-01-18 15:47:17	05:48:03	2	●	
Coarse Depth Map				●	
Total:			29:36:44		

Data Preparation					
Pipeline	Start	Duration	Runs	Status	
SG Separation	2017-07-06 10:41:39	02:37:33	3	●	
Spectroscopic Sample	2017-09-14 10:35:29	00:00:26	30	●	
Training Set Maker	2017-09-14 10:50:47	00:17:25	11	●	
Photo-z Training	2017-07-12 19:33:23	01:30:13	17	●	
Photo-z Compute	2017-07-28 18:43:13	03:28:14	21	●	
Galaxy Properties				●	
Total:			7:53:51		

Science-ready Catalogs					
Pipeline	Start	Duration	Runs	Status	
Cluster	2017-09-11 10:27:48	05:04:02	10	●	
GE				●	
GA	2017-05-12 13:37:02	01:35:01	3	●	
LSS	2017-06-07 16:14:24	02:42:36	3	●	
Genetic				●	

Special Samples					
Pipeline	Start	Duration	Runs	Status	
ELG Sample	2017-06-07 10:26:47	00:04:25	2	●	
RED LSS Sample	2017-06-09 15:59:29	00:06:55	2	●	
Catalog Association				●	

Science Workflows					
Pipeline	Start	Duration	Runs	Status	
ACF GE				●	
ACF LSS	2017-06-09 11:39:57	02:12:36	1	●	
StarHorse	2017-05-12 16:12:48	30:05:20	1	●	
WAZP	2017-08-04 15:18:46	00:39:30	4	●	

Parameter Estimation					
Pipeline	Start	Duration	Runs	Status	
Cluster-Cluster Matching	2017-06-15 00:27:34	06:00:45	24	●	
Cluster-Halo Matching	2017-04-18 09:20:56	00:14:51	1	●	
Concatenate Fields	2017-02-01 23:33:59	00:51:11	4	●	
Download Tool	2017-06-13 13:02:01	00:00:35	30	●	
Export Table	2017-06-29 15:03:40	38:34:42	202	●	

Utilities					
Pipeline	Start	Duration	Runs	Status	
Catalog Comparison	2016-06-05 14:04:35	01:08:43	5	●	
Cluster-Cluster Matching	2017-06-15 00:27:34	06:00:45	24	●	
Cluster-Halo Matching	2017-04-18 09:20:56	00:14:51	1	●	
Concatenate Fields	2017-02-01 23:33:59	00:51:11	4	●	
Download Tool	2017-06-13 13:02:01	00:00:35	30	●	
Export Table	2017-06-29 15:03:40	38:34:42	202	●	



Introduction

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Science Portal

**Conclusions**



- ▶ Galaxy clusters comprise a powerful tool for constraining cosmology.
- ▶ It is extremely important to consider the observational effects.
- ▶ The proposed functional form for the corrections on the prediction agrees with simulation measurements at medium and high richnesses.
- ▶ The pipeline for halos was shown to be operating properly.
- ▶ The pipeline for clusters will be operating soon.
- ▶ We (DES-Brazil) are producing a  $w_aZ_p$  catalog for the DES Y1 data in the portal.

A background image of a starry night sky. The stars are of various colors, including yellow, white, and blue. A faint constellation outline is visible, consisting of several bright stars connected by thin lines. The text "Thank You!" is centered in the middle of the image.

Thank You!

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