## Probing Cosmic Acceleration with Galaxy Clusters

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#### Overview

- Introduction
  - Cosmic acceleration
  - Galaxy cluster surveys
- Gravitational lensing for current & next generation cluster cosmology
  - Part I: Cluster lensing signals
  - Part II: Covariance matrices

#### Discovery of cosmic acceleration









Adam G. Riess

#### Saul Perlmutter

Brian P. Schmidt

National University

2011 Nobel Prize in Physics





Perlmutter, Schmidt, and Riess used Type Ia Supernovae to accurately determine the **redshift-distance relation**. They found that the Universe is accelerating.



#### Dark matter vs. dark energy



In general,  $P = w \rho$  (equation of state),  $\rho \propto a^{-3(1+w)}$ w = -1: cosmological constant

#### What causes the cosmic acceleration?



We need measurements other than the expansion rate.

# Dark energy slows down the growth of large-scale structure



Sims: Jenkins et al. (1998)

Observing the density peaks as a function of time can help us constrain dark energy parameters.

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### Galaxy clusters: the highest density peaks



2%

10%

88%

 $1 \text{ M}_{\odot} \approx 2 \times 10^{30} \text{ kg}$ Mass ~  $10^{14}$  to  $10^{15}$  M<sub> $\odot$ </sub> Size ~ a few million parsecs (Mpc)

1 parsec  $\approx$  3 lightyears  $\approx 3 \times 10^{16} \,\mathrm{m}$ 

### How do galaxy clusters form?

![](_page_9_Picture_1.jpeg)

Simulation: Heidi Wu. Visualization: Ralf Kaehler

# Measuring dark energy using the number counts of galaxy clusters

![](_page_10_Figure_1.jpeg)

We need to infer cluster mass from observable properties.

#### Dark energy constraints from clusters

![](_page_11_Figure_1.jpeg)

de Haan et al. (2016), South Pole Telescope

### Optical surveys of galaxy clusters

![](_page_12_Picture_1.jpeg)

2013-2019 4m Blanco Telescope in Chile 1/8 of sky, 300 million galaxies, ~200,000 clusters

![](_page_12_Picture_3.jpeg)

wfirst.gsfc.nasa.gov launch: mid-2020s

#### Importance of precise mass calibration

![](_page_13_Figure_1.jpeg)

### How to measure the mass of galaxy clusters?

Galaxies

![](_page_14_Figure_2.jpeg)

- Number of galaxies (richness)
- Velocity dispersion

![](_page_14_Figure_5.jpeg)

![](_page_14_Picture_6.jpeg)

- X-ray emission
- Sunyaev-Zeldovich (SZ) effect: scattering of photons of cosmic microwave background (CMB)

#### Dark matter halo

![](_page_14_Picture_10.jpeg)

Gravitational lensing

### How to measure the mass of galaxy clusters?

Galaxies

![](_page_15_Figure_2.jpeg)

![](_page_15_Picture_3.jpeg)

Dark matter halo

![](_page_15_Picture_5.jpeg)

- Number of galaxies (richness)
- Velocity dispersion (Wu et al. 2013)
- X-ray emission (Wu et al. 2015)
- SZ effect

Gravitational lensing (this talk)

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# Measuring halo mass using gravitational lensing effect

#### Strong lensing (rare)

![](_page_17_Picture_2.jpeg)

![](_page_17_Picture_3.jpeg)

# Measuring halo mass using gravitational lensing effect

#### Weak lensing (everywhere)

![](_page_18_Picture_2.jpeg)

### Inferring cluster mass from weak lensing

![](_page_19_Figure_1.jpeg)

Figure from Wikipedia

Distance to cluster center

Lensing signal: tangential shear ( $\gamma_t$ ) ~ excess surface mass density ( $\Delta\Sigma$ )

# Part I: Modeling the cluster lensing signal using simulations

in collaboration with Zhuowen Zhang, Chun-Hao To, Yuanyuan Zhang, Tom McClintock, Matteo Costanzi, Eduardo Rozo, Joe DeRose, and many others in the **Dark Energy Survey** collaboration Buzzard Simulations DeRose et al. (arXiv: 1901.02401)

- Mock catalogs for the DES volume
- Based on dark matter N-body simulations.
- Galaxies are assigned to dark matter particles based on local density
- Recovering the observed galaxy correlation functions

redMaPPer Cluster Finder Rykoff & Rozo et al. (2014)

- Identifying clusters using red-sequence in photometric data
- Assigning cluster membership probability for each galaxy
- Richness "λ" (similar to the number of galaxies in a cluster)
- For Buzzard sims, we apply redMaPPer to the halo center (thus avoiding mis-centering effect)

![](_page_23_Picture_1.jpeg)

Combining the weak lensing signal of clusters of similar "richness" (# of galaxies)

![](_page_23_Figure_3.jpeg)

![](_page_24_Picture_1.jpeg)

Combining the weak lensing signal of clusters of similar "richness" (# of galaxies)

![](_page_24_Figure_3.jpeg)

![](_page_25_Picture_1.jpeg)

Combining the weak lensing signal of clusters of similar "richness" (# of galaxies)

![](_page_25_Figure_3.jpeg)

![](_page_26_Picture_1.jpeg)

Projected Distance [Mpc/h]

### Is there a selection bias in this process?

![](_page_27_Figure_1.jpeg)

Step 1: selecting clusters based on richness, calculating the PDF of the underlying halo mass

Step 2: select random halos from the entire sim to match this mass PDF Step 3: taking the ratio of lensing signals. The ratio would be 1 if there's no selection bias. We found ~10-30% bias in lensing signal.

## Systematic effect 1: Orientation Bias Systematic effect 2: Projection Effect

#### Impact of halo orientation on cluster lensing

![](_page_29_Figure_1.jpeg)

#### Impact of orientation on selection

![](_page_30_Figure_1.jpeg)

#### Impact of halo orientation on richness

![](_page_31_Figure_1.jpeg)

Preliminary

#### Systematic effect 2: Projection Effect

### Projection effect changes observed richness

![](_page_33_Picture_1.jpeg)

- The true number of galaxies in a cluster (true richness, or  $\lambda_{true}$ ) has some intrinsic scatter.
- If redshift uncertainties are large, we tend to include galaxies along the line-of-sight as cluster members (observed richness, or  $\lambda_{obs}$ ).
- Projection effect thus changes richness and adds scatter.
- Mass along the line-of-sight can also increase lensing signal.

#### Quantifying the projection effect (Costanzi et al. 2019)

![](_page_34_Figure_1.jpeg)

λ(z): measuring
 richness at various
 redshift

- Peak: contribution from galaxies in the cluster
- Wings: contribution comes from galaxies outside the cluster

The spread of  $\lambda(z)$  quantifies the projection effect (denoted as  $\sigma_z$ )

# Cluster finders tend to select clusters with stronger projection effect

![](_page_35_Figure_1.jpeg)

### Orientation & projection can explain most of the lensing biases

![](_page_36_Figure_1.jpeg)

Preliminary

### Summary of Part I: Modeling cluster lensing signals

- Stacked weak lensing signal based on richnessselected clusters can suffer from selection bias.
- Orientation bias: halos with axes parallel to line-ofsight has higher richness and stronger lensing signal.
- Projection effect: changes richness and lensing signal simultaneously.
- Taking into account these two effect removes most of the systematic errors of lensing. We are working on detailed modeling for cosmology analyses.

# Part II: Modeling the covariance matrices for cluster lensing

in collaboration with Andres Salcedo, Ben Wibking, David Weinberg, and others in the **WFIRST** team

### Simulations vs. Analytic Calculations

![](_page_39_Figure_1.jpeg)

- Analytic calculations: cannot capture medium/small-scale correctly
- Ray-tracing sims: limited to > 1 Mpc, expensive to run
- We combine high-resolution N-body sims with analytic calculations, validating with ray-tracing sims.

# Three major components for lensing covariance matrices

- 1. Shape noise  $(~1/N_{gal})$
- 2. Large-scale structure (analytical calculations)
- Intrinsic variation of halo density profile (small-scale, N-body sims)

#### Shape noise due to intrinsic galaxy ellipticity

![](_page_41_Figure_1.jpeg)

#### Noise from Large-Scale Structure

![](_page_42_Picture_1.jpeg)

- All uncorrelated large-scale structures in front of source galaxies contribute to lensing noise.
- It dominates large-scale lensing error (where cluster signal is low and shape noise is also low).
- It can be calculated analytically assuming Gaussian random field.

Figure from Millennium Simulation

### Noise from Intrinsic Variation of Halo Density Profiles

![](_page_43_Figure_1.jpeg)

 At a given halo mass, halos have diverse projected density profiles due to different concentration, triaxial shape, etc.

# Combining N-body simulations and analytical calculations

![](_page_44_Figure_1.jpeg)

Small scales: using halos from N-body simulations
Large scales: analytical calculations assuming Gaussian random fields (infeasible to use N-body simulations)

 Grafting the two regimes together, validating with ray-tracing simulations

#### A full cluster lensing covariance matrix

![](_page_45_Figure_1.jpeg)

Off-diagonal elements decrease rapidly, especially at largescales.

#### Importance of off-diagonal elements

47

![](_page_46_Figure_1.jpeg)

Ignoring the off-diagonal elements would lead to ~2x underestimation of lensing error budget
The underestimation is worse when shape noise is low

#### Importance of shape noise

![](_page_47_Figure_1.jpeg)

### Summary of Part II: Cluster lensing covariance matrix

- Current cluster surveys like DES are limited by shape noise. For future cluster surveys like LSST and WFIRST, the noise will be dominated by large-scale structure and halo profile variance.
- We combine analytic calculations and high-resolution Nbody simulations to calculate the covariance matrix accurately.

#### Summary

- The abundance of galaxy clusters is a sensitive probe of cosmic acceleration.
- Calibrating the mass-observable relation is the key for cluster cosmology.
- Optical surveys use stacked gravitational lensing to calibrate cluster mass. We use simulations to remove the systematic uncertainties.
- Upcoming optical surveys like LSST, WFIRST will achieve unprecedented precision for gravitational lensing and push our horizons further.