# Cosmologic Insights from Galaxy Cluster and Weak Lensing Analyses

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in collaboration with DES and SPT

Unsolved Problems: dark energy, GR or modification early probe vs late time probe tensions

#### Halo Mass Functions as a Cosmological Probe

- Abundance of collapsed halos increases over time and is sensitive to the growth rate of density perturbations
- Baryonic effects are present, because feedback redistributes mass and alters the HMF
- A survey of halos is also sensitive to the volume-redshift relation



Halo mass constraints crucial



#### Galaxy Cluster Observables and Selection

# Cluster finding: SZE, X-ray and Optical eROSITA Extragalactic sky







In all cases, use cluster Red Sequence galaxies to estimate redshift) and active galactic nuclei (10<sup>6</sup>)

#### *Cluster* Mass Function as Cosmological Probe

Galaxy Clusters are the most massive collapsed halos

- Baryonic effects less important
- Relatively easily observable: X-ray, SZE, optical richness. WL shear
- Select by "observable" rather than mass
  - Power-law mass-observable scaling relations exist
  - Connect Observations to HMF through these scaling relations
  - Account for selection effects in modeling
- Science Driver for large, multi-wavelength surveys
  - e.g., SPT, DES and later eROSITA
- Weak lensing to calibrate cluster masses is essential





Haiman+2001

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### SPT SZE-selected Cluster Cosmology

#### • Dataset:

- 343 SZE selected clusters ( $\xi$  is SZE observable, and  $\xi$ >5, Bleem+2015)
- Weak lensing (WL) data on 32 clusters
- SZE-mass-redshift power law scaling relation with scatter (4 params)
- Bayesian analysis w/ Poisson likelihood for counts and  $\chi^2$  likelihood for WL shear profile

$$\ln \mathcal{L}(\boldsymbol{p}) = \sum_{i} \ln \frac{dN(\xi, z | \boldsymbol{p})}{d\xi dz} \Big|_{\xi_{i}, z_{i}} - \int_{z_{\text{cut}}}^{\infty} dz \int_{\xi_{\text{cut}}}^{\infty} d\xi \frac{dN(\xi, z | \boldsymbol{p})}{d\xi dz}$$

Model accounts for selection biases (Eddington, Malmquist)

$$\frac{dN(\xi, z \mid \boldsymbol{p})}{d\xi dz} = \int dM' P(\xi \mid M', z, \boldsymbol{p}) \frac{dN}{dM dz}(M', z \mid \boldsymbol{p})$$



#### SPT Cluster Cosmology Results 2019

#### • Takeaways:

- Cluster dataset well described by our model
- Constraints in good agreement with other probes
- Comparable uncertainties to other probes





Sebastian Bocquet

Bocquet+2019

### Next step is SPTxDES analysis

• Since then we have been preparing a more sensitive analysis:

- Enlarging sample through more SPT data and improved techniques (3x clusters)
- Combining cluster counts with DES WL constraints (650 clusters)
- Expanding toolkit to constrain cluster masses with WL shear profiles
- Developing a framework for incorporating WL mass systematics
- Running a fully blinded analysis

### Expanded SPT SZE-selected Sample

- SPT summer fields and 500d added
- Optical followup tool MCMF (Klein+18,19) applied
  - employs existence of optical cluster associated with SZE candidate to expand and clean the SPT sample
- Low contamination (<2%), excellent photo-z's (RMS $\left[\frac{\delta z}{(1+z)}\right] \approx 0.005$ )

Current cosmo sample: **1009** clusters



Matthias Klein





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#### Weak Lensing Mass Constraints from DES

- The DES Shear and Photo-z catalogs have been prepared primarily to support 3x2pt cosmology
  - Extensive characterization of systematics
- Cluster specific improvements required:
  - Cluster member contamination modeling
  - Cluster mis-centering modeling
- DES contains a tremendous amount of cluster mass information
  - See stacked Delta-Sigma profiles for ~2000 SZE and X-ray selected clusters



Aditya Singh

### **Characterizing WL Mass Systematics**

- Common framework for all weak-lensing modeling ingredients (Grandis, <u>Bocquet</u> et al. 2021)
- Mass modeling (halo profiles, miscentering, uncorrelated LSS)
- Shear modeling (shear and photo-z calibration, cluster member contamination)
- Relate hydro halo profiles to gravity-only halo mass function
- Calibrate mis-match between NFW model and realistic synthetic lensing data ((z, M)-dependent bias & (z, M)-dependent scatter)
- <u>Estimate Impact of baryonic effects:</u> compare Magneticum and Illustris TNG hydrodynamical simulations: 2% difference in mass
- Characterize  $M_{WL}$ - $M_{halo}$  relation as f(M,z)
  - Total systematic weak-lensing uncertainty in DES Year 3:
    3 6 % as function of cluster redshift

#### Projected Magneticum Halo





Sebastian Grandis



### Bocquet+22(or 23?) Status

#### • Analysis strategy:

- Similar Poisson likelihood for abundance
- Cluster by cluster WL shear profile likelihood
- SZE-mass, optical richness-mass, M<sub>WL</sub>-mass scaling relations
  - 10 params + correlated scatter (SZE, WL,  $\lambda$  )
- Validation on mocks, Blinded tests on data ongoing
- Mocks indicate this will be best chance yet to test S8 tension with clusters...





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## Recent Results on eROSITA Cluster Cosmology

Chiu, Klein, Mohr, Bocquet 2022, MNRAS submitted (https://arxiv.org/pdf/2207.12429.pdf)

- We recently carried out the first cosmological analysis of the eROSITA cluster sample using a public eFEDS survey (140 deg<sup>2</sup>) dataset using public HSC weak lensing
  - 455 clusters after optical cleaning with MCMF, 177 with WL data
  - Expected contamination of 6% (20% contamination in original eFEDS sample)
- Similar approach as SPTxDES but for X-ray selected sample we have:
  - X-ray count rate-mass-redshift relation (η is count rate; 5 params)
  - Optical richness-mass-redshift relation, too (5 params)
- Complication: analyzed eFEDS "extent" selected sample, and therefore had to model incompleteness in η selected sample introduced by extent selection
  - Used MCMF to identify ALL clusters (including in unresolved sample)





I-Non Chiu

### The eFEDSxMCMF sample

- eFEDS clusters are lower mass and span broad redshift range
- HSC WL shear profiles used in similar manner (M<sub>WL</sub>-M<sub>halo</sub>)
- Model consistency with data is encouraging

10<sup>2</sup>

All

 $\lambda$  distribution

λ

101





10<sup>1</sup>

100

(Y) 10<sup>-1</sup> 10 0

 $N(\lambda) - I$ -10

10

(Y)N





Matthias Klein

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### **Scaling Relation Constraints**

- The data follow the scaling relations well
  - 5 param power law rel'ns (plus correlated scatter) adequate





I-Non Chiu

### eROSITA Cosmological Constraints

#### • Fully blinded analysis

Constraints in good agreement with other probes (no tension with Planck)



Ire 18. The comparisons of the cosmological parameters assuming the ACDM cosmology between the eFEDS clusters (blue) and the external



I-Non Chiu

## Summary

- Bayesian analysis framework to handle multi-wavelength cluster samples and incorporate systematic uncertainties has been demonstrated
- SPT and eROSITA cluster samples supported by weak lensing mass constraints are promising cosmological probes
- Larger SZE and X-ray selected samples on the horizon
- Dramatic improvements in WL data expected from Euclid and Rubin
- Such samples provide leverage to address many Unsolved Problems DE, DM, modified gravity, neutrino masses, etc