

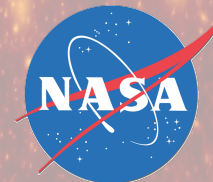
# *The Physics of Galaxy Cluster Outskirts*

*Daisuke Nagai*

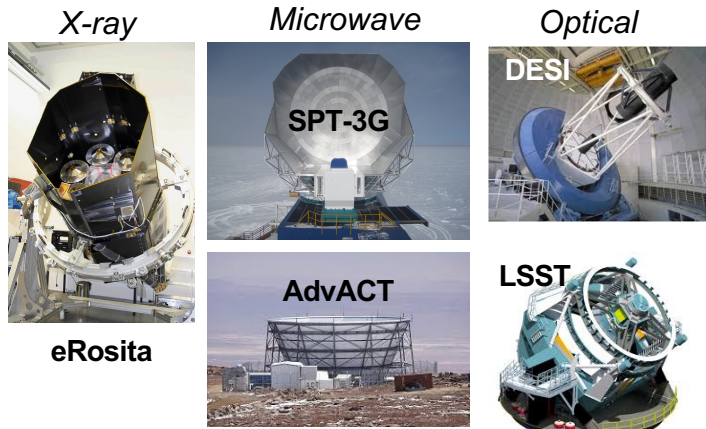
*Yale University*

*ICM workshop, Copenhagen*

*Aug 15, 2022*



# Modeling Challenges in the Era of Multi-wavelength Cluster Surveys



## Opportunity

Cosmology with Multi-Wavelength Observations of Dark Matter Halos (including clusters, groups & galaxies)

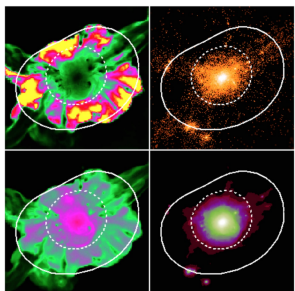
## Challenge

Develop a physically-motivated and computationally efficient model for forward-modeling the **DM halo-galaxy connection** (e.g., scatter, covariance, selection function etc) for cosmological **inference** with large cosmological surveys

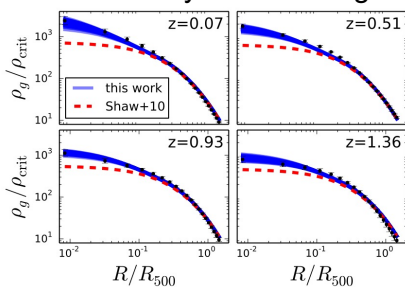
## Frontiers

1. **Computational:** gain physical insights from *hydrodynamical cosmological simulations*
2. **Modeling:** develop of *a physically-motivated, computationally efficient model*
3. **Data-Driven:** extract more from large simulation & observational data using *machine learning*

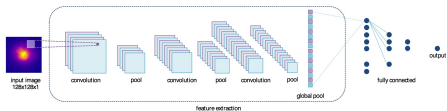
## Computer Simulation



## Analytical Modeling



## Machine Learning



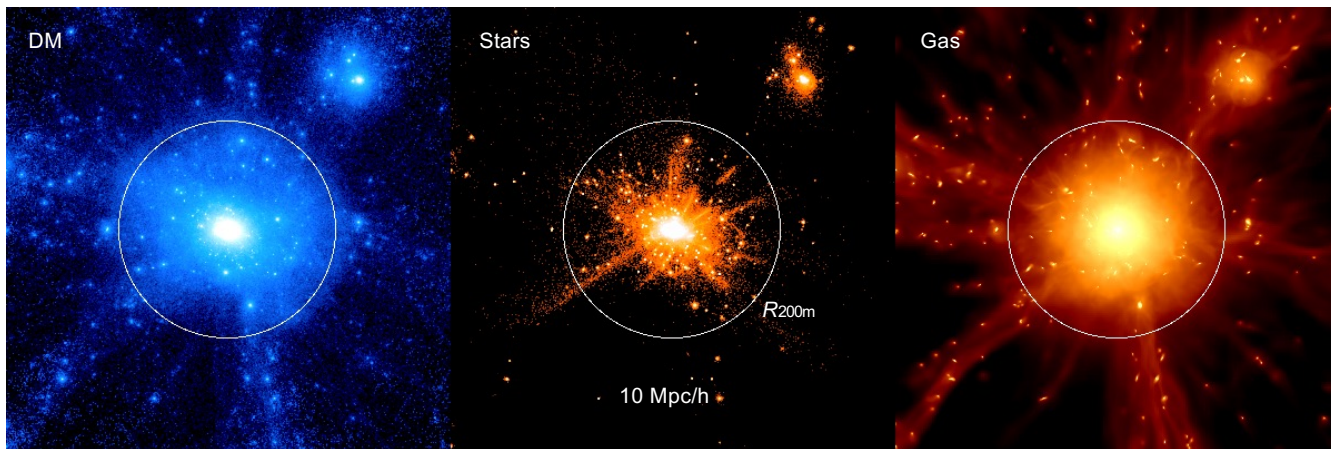
# ***Computational Frontier***

***gain physical insights on the non-linear structure formation  
using hydrodynamical cosmological simulations***

# *Omega 500 Simulation Project*

**High-Resolution  $N$ -body+Gasdynamics Cosmological Simulation with Adaptive Refinement Tree (ART) code on Yale's OMEGA HPC Cluster**

Box size =  $500h^{-1}$  Mpc, DM particle mass  $\approx 10^9h^{-1}M_{\odot}$ , Peak Spatial Resolution  $\approx 3.8 h^{-1}$  kpc



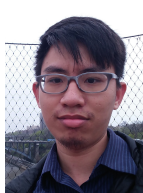
Kaylea Nelson



Camille Avestruz



Erwin Lau

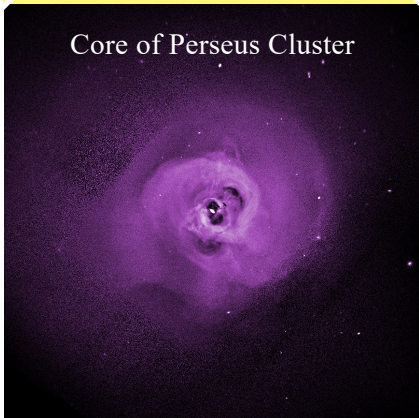
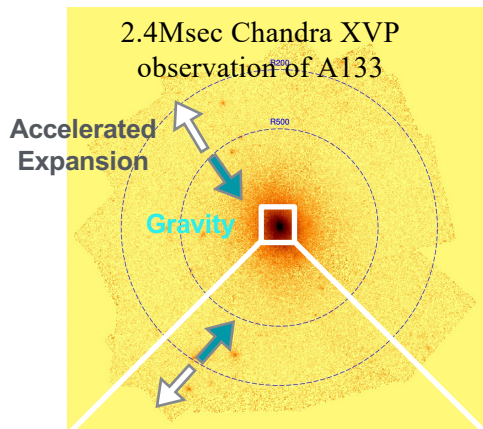


Han Aung

- $500h^{-1}$  Mpc zoom-in cosmological hydrodynamical simulations of 65 galaxy clusters with  $M_{500c} > 3 \times 10^{14} h^{-1} M_{\odot}$  in WMAP5 cosmology (Nelson et al. 2014)
- Three runs: (1) simple non-radiative gas physics, (2) +galaxy formation physics, (3) +AGN feedback physics.

# ICM Physics

## Insights from Hydro Simulations



### ◆ Cluster Outskirts

Gas Accretion & Non-equilibrium phenomena

1. Gas clumping/inhomogeneities
2. Non-thermal pressure due to gas motions
3. Shapes of DM halo & gas
4. Splashback & Shock Radii
5. Non-equilibrium electrons
6. Filamentary gas streams

*Tractable*

*Key Parameters*

*Mass & MAH/Mergers*

Walker et al. 2019 for a recent review

### ◆ Cluster Cores

Heating, Cooling & Plasma physics

1. AGN feedback (Mechanical/CR heating)
2. Dynamical Heating, Gas sloshing
3. Thermal Conduction, Magnetic Field, He sedimentation

*Great science targets for ongoing and planned X-ray missions*

*(e.g., eROSITA & LEM) - Talks by Analisa, Dylan, Nhut, Maxim, and more!*

# Non-thermal Pressure

## Analytical Model vs. Hydro Simulations

Shi & Komatsu 2014 (analytical model)

$$\frac{d\sigma_{\text{nth}}^2}{dt} = -\frac{\sigma_{\text{nth}}^2}{t_d} + \eta \frac{d\sigma_{\text{tot}}^2}{dt}$$

Time Change in  
Turbulence  
Energy per unit  
mass

Dissipation  
of  
Turbulence

Generation of  
Turbulence  
sourced by  
mass  
accretion

Implications for the HSE mass bias

Shi, Komatsu, Nagai, Lau 2016

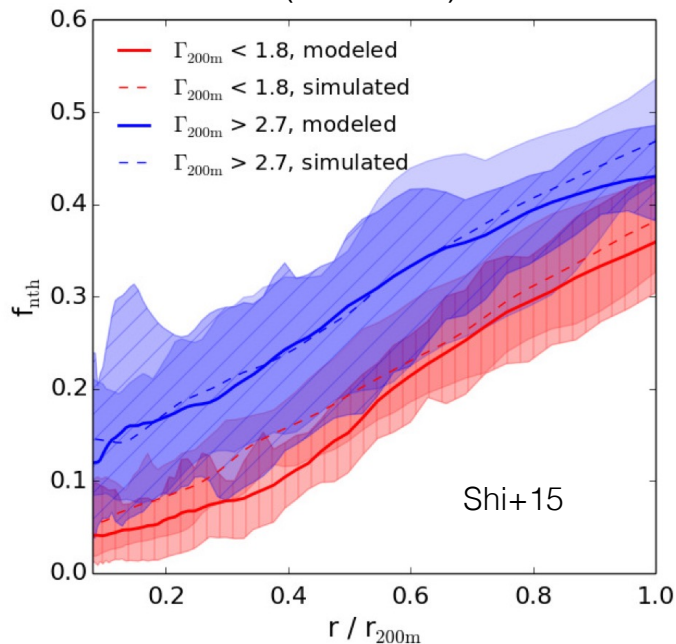
Turbulence evolution in the density stratified medium

Shi, Nagai, Lau 2018

Impact of Non-thermal pressure on tSZ effects

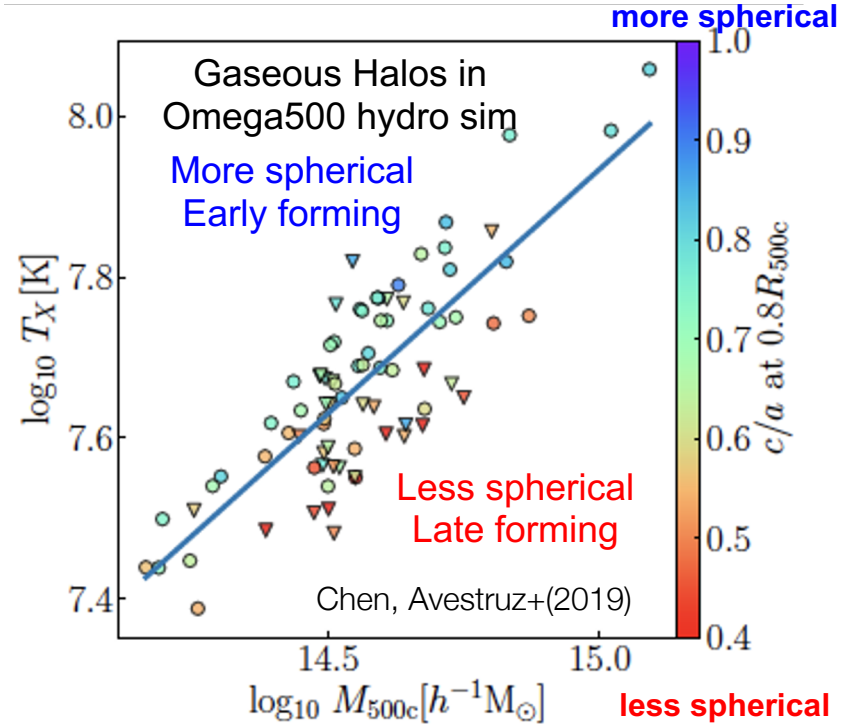
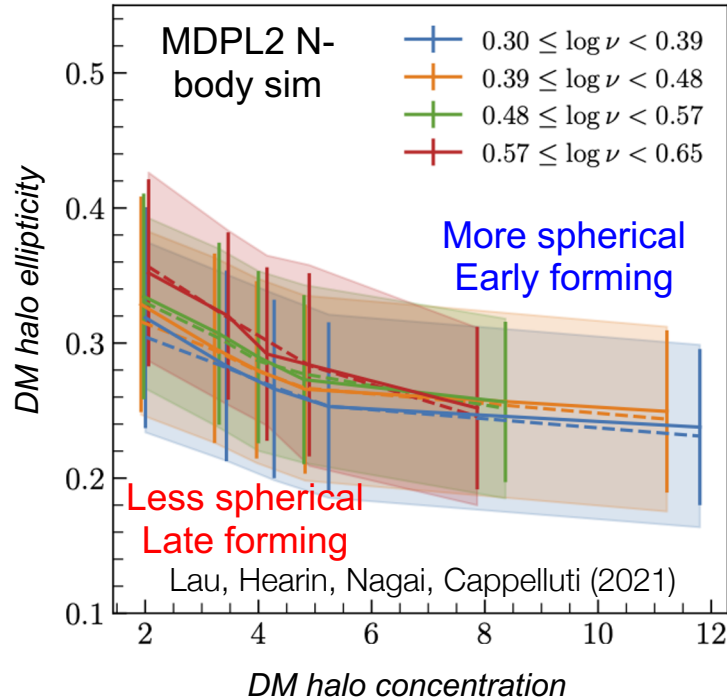
Green, Aung, Nagai, van den Bosch 2020

Comparison to the Omega 500 simulation  
(Nelson+14)



Semi-analytic model can match the results of hydrodynamical simulations remarkably well

# Halo & Gas Shape and Formation History

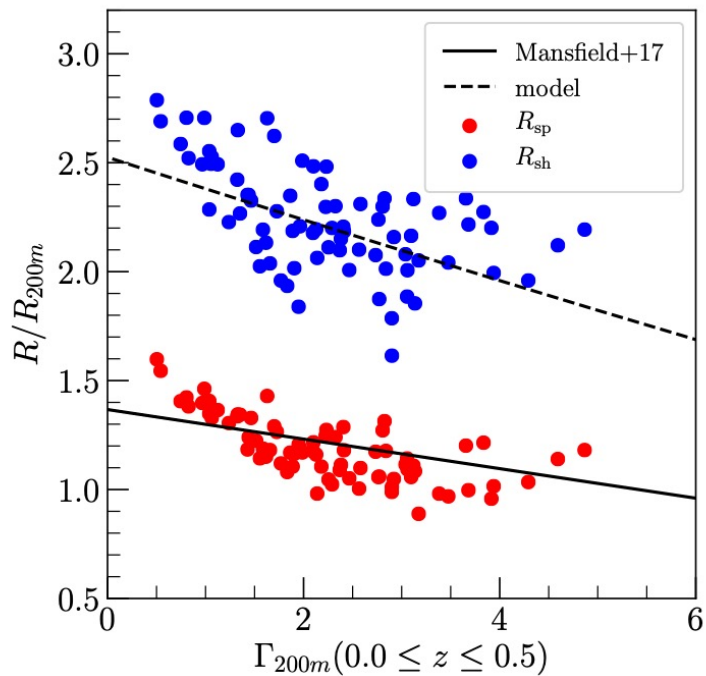
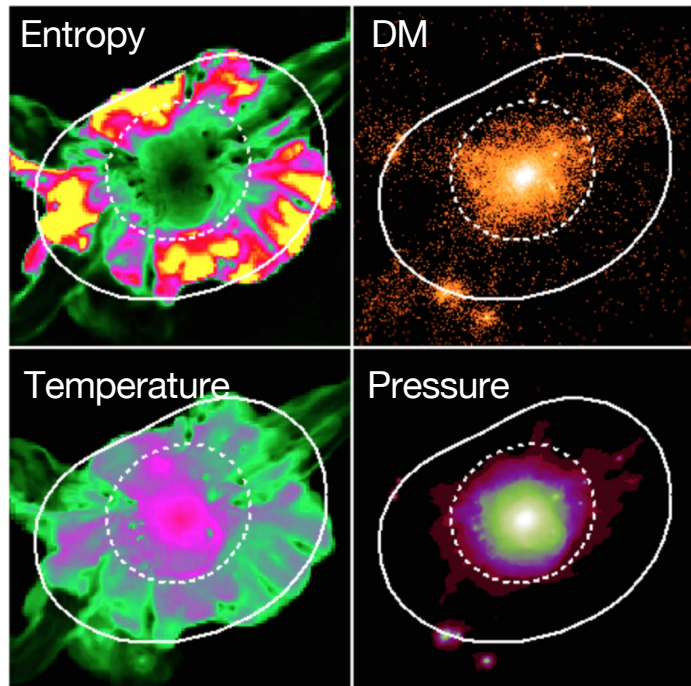


- DM halo & gas shapes depend on its formation history: early-forming/higher concentration halos are more spherical
- Systematic scatter in observable scaling relation driven by halo formation history

# Splashback vs. Accretion Shock Radii

DM splashback computed using SHELLFISH (Mansfield+17)

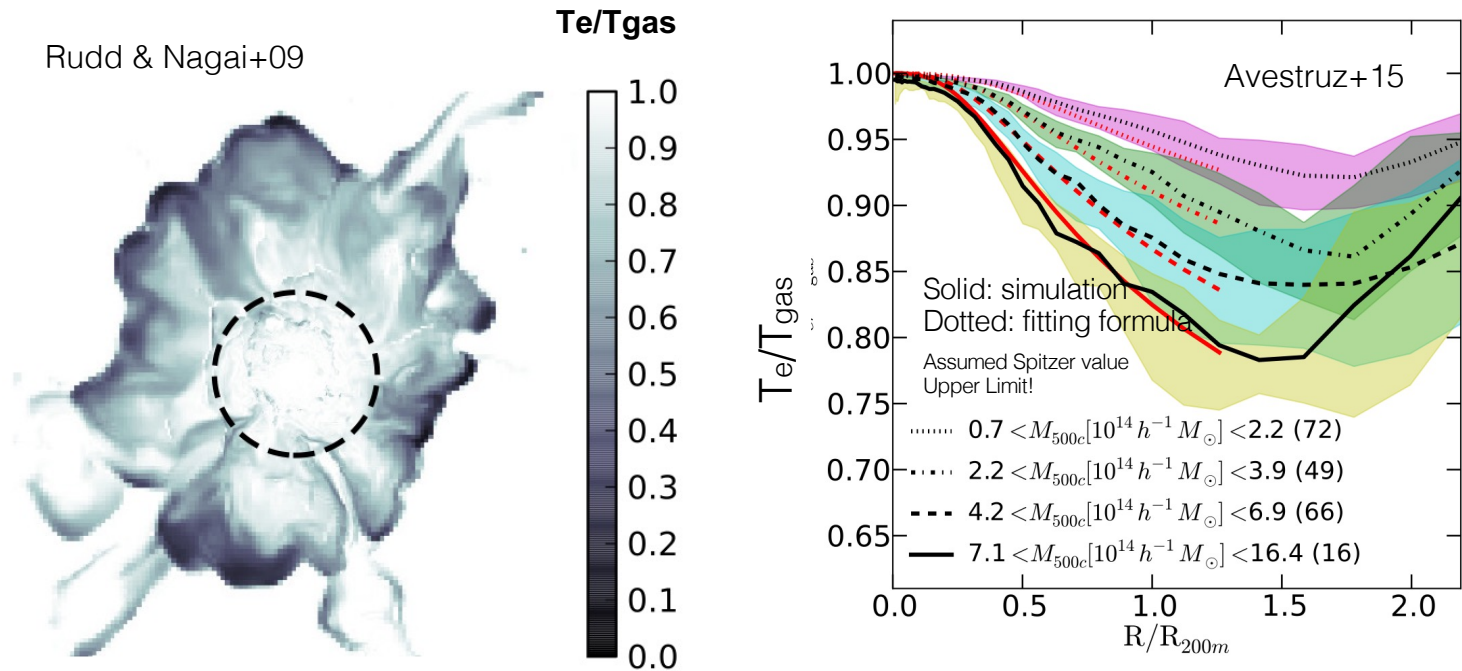
Aung, Nagai, Lau 2020



Accretion shock radius is  $\sim 2$  times larger than the Splashback radius, making the hot gas extend beyond the splashback radius.



# Beyond Hydrodynamics: Electron-Proton Equilibration in Cluster Outskirts

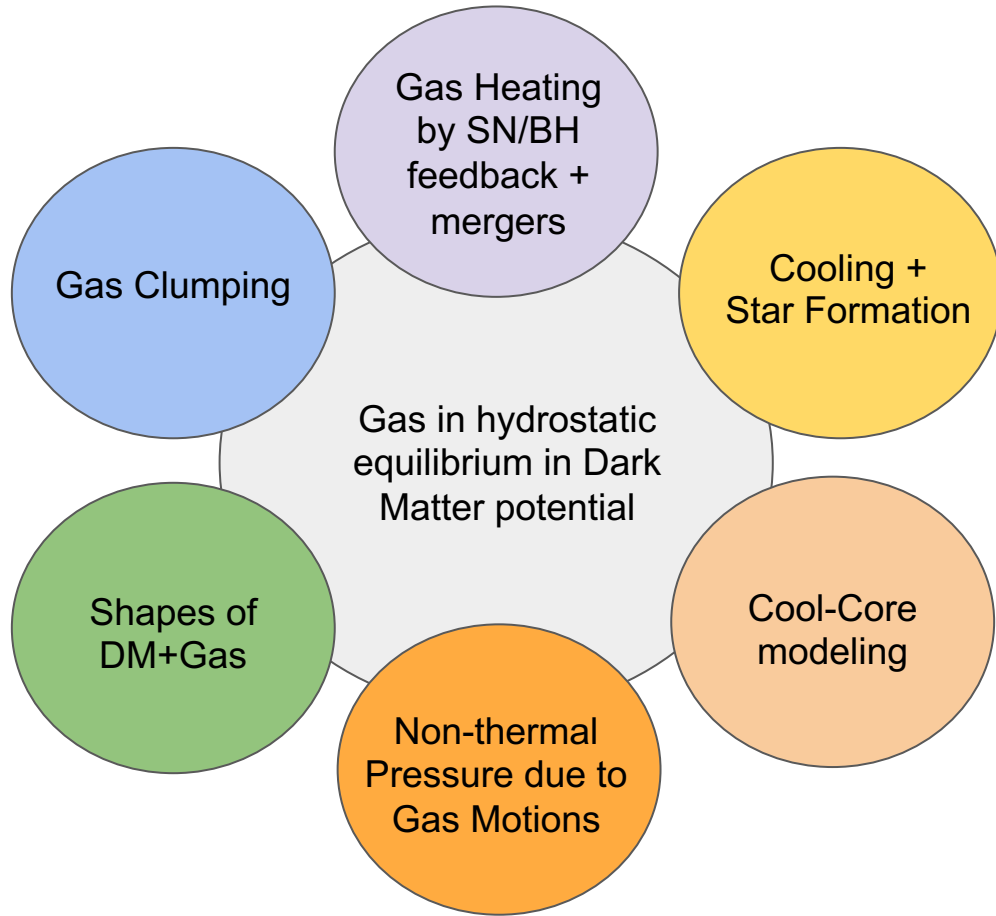


In the outskirts of galaxy clusters, the collision rate of electrons and protons becomes longer than the age of the universe (see Anbajagane+22 for the recent SPT detection)

# ***Modeling Frontier***

***develop a physically-motivated, computationally efficient model for modeling multi-properties of galaxies, groups, and clusters***

# Baryon Pasting Project



## Goals

Maximize the scientific returns of multi-wavelength surveys of galaxy clusters and LSS via Multi-wavelength Astronomical Surveys

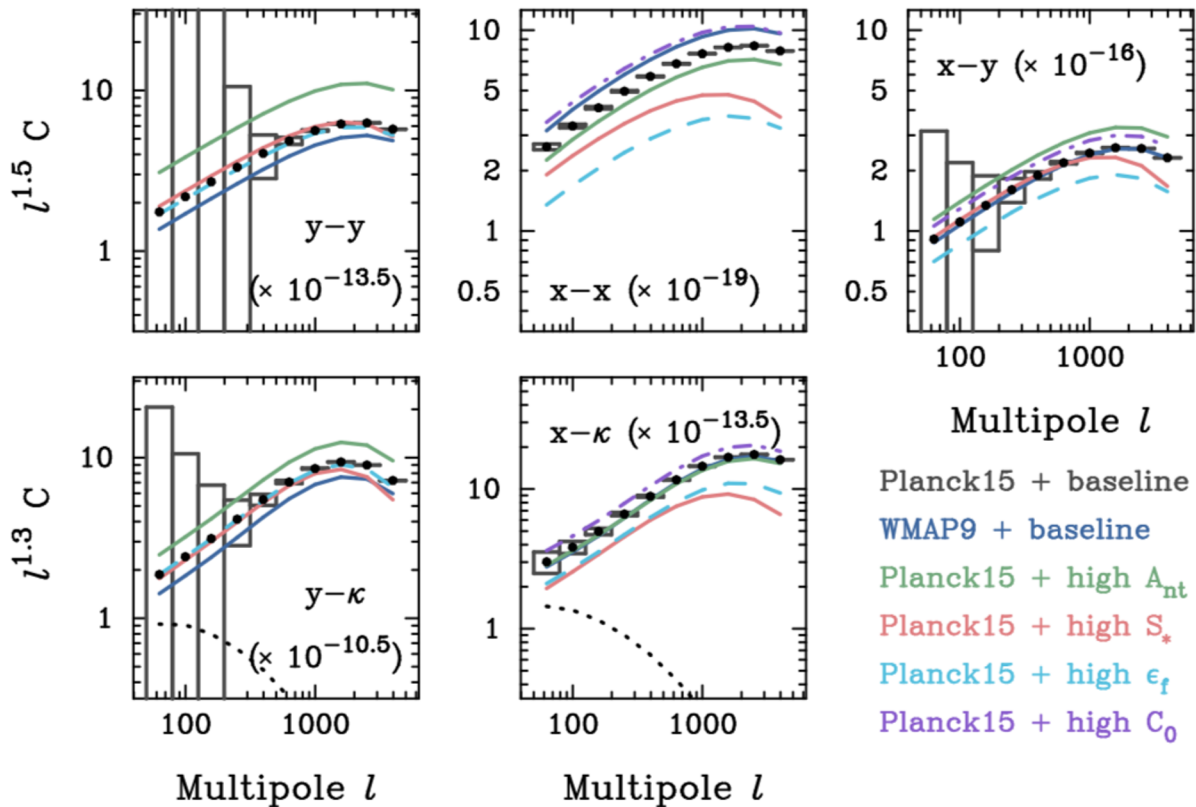
## Challenges

- **Halo-Gas Connection:** modeling of SZ and X-ray profiles of ICM and CGM
- **Baryonic effects:** constraining baryonic effects with WL x SZ cross-correlations

## Solution

Develop a **simple, physically-motivated computationally efficient method** for modeling multi-properties of clusters, groups, and galaxies

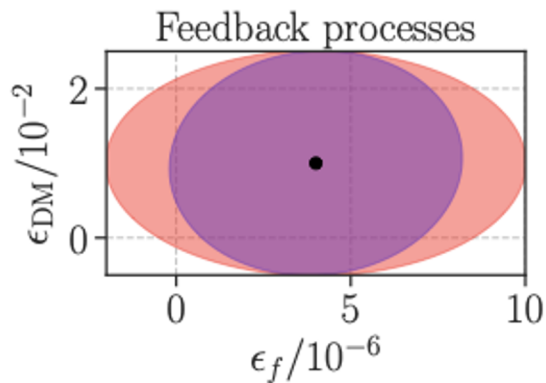
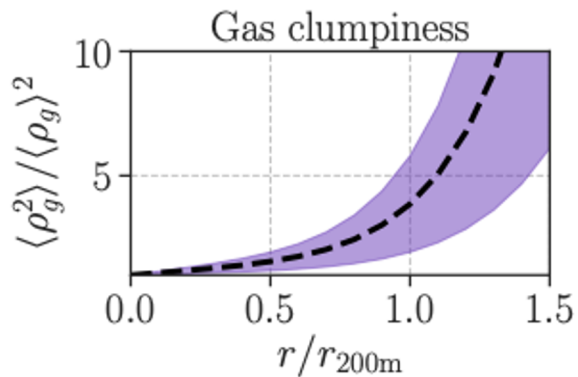
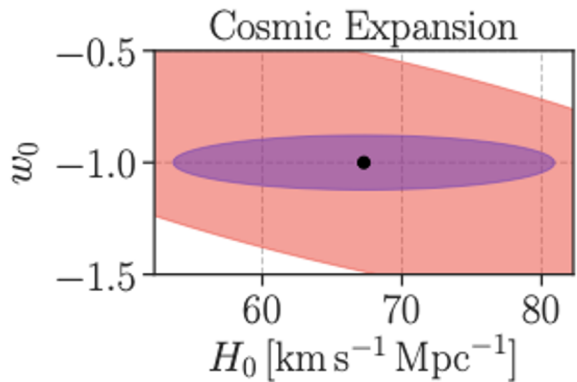
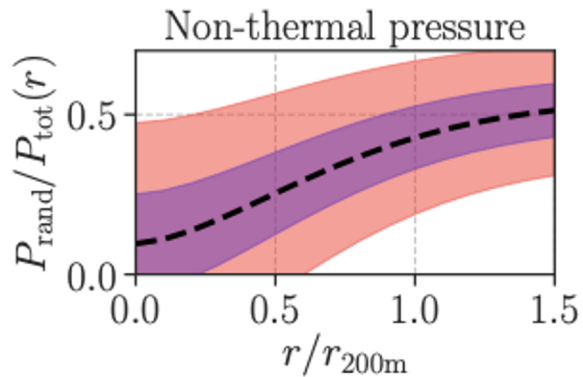
# Probing Cosmology & Astrophysics with Multi-wavelength surveys



Auto- and cross-power spectra measurements are sensitive to the lensing bias, non-thermal pressure, feedback and gas clumping.

Shirasaki, Lau & Nagai (2020)

# Probing Cosmology & Astrophysics with Multi-wavelength Surveys

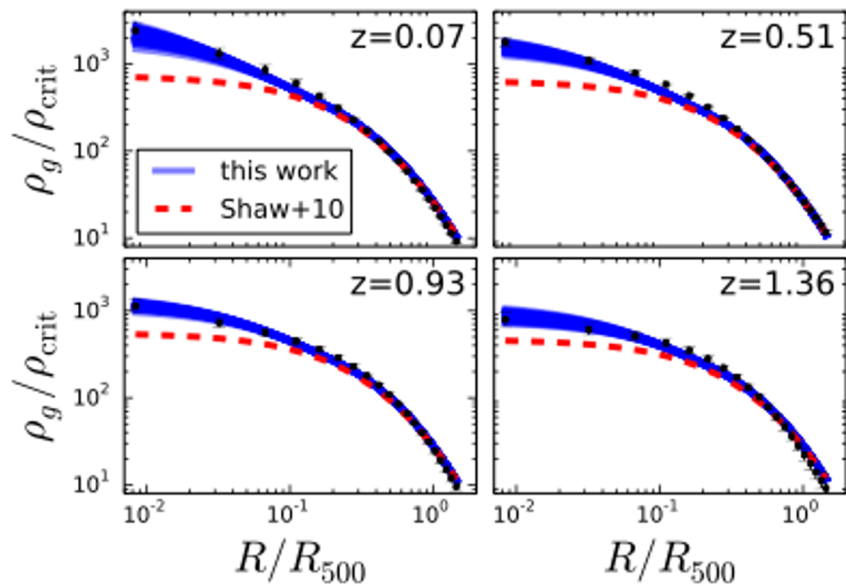


*Microwave+Optical+X-ray*

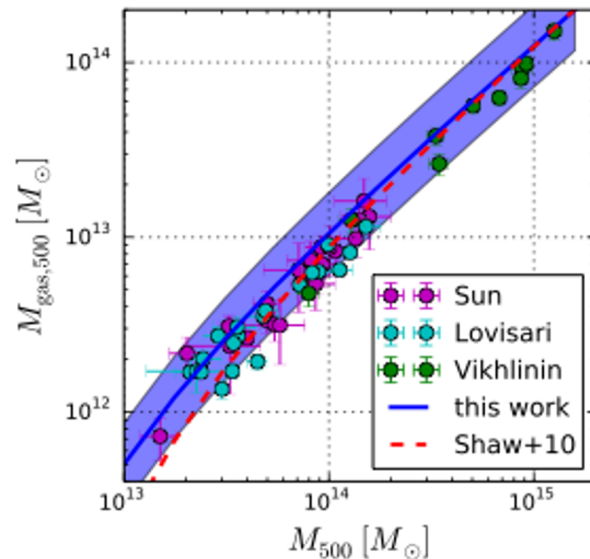
Measuring the **angular power spectra** in X-ray (eROSITA), microwave (CMB-S4), and optical (Rubin) lead to improved constraints on cosmology and astrophysics

Shirasaki, Lau & Nagai (2020)

# BP Modeling of X-ray Clusters & Groups



McDonald+13,17:  
X-ray measurements of **gas density profiles**

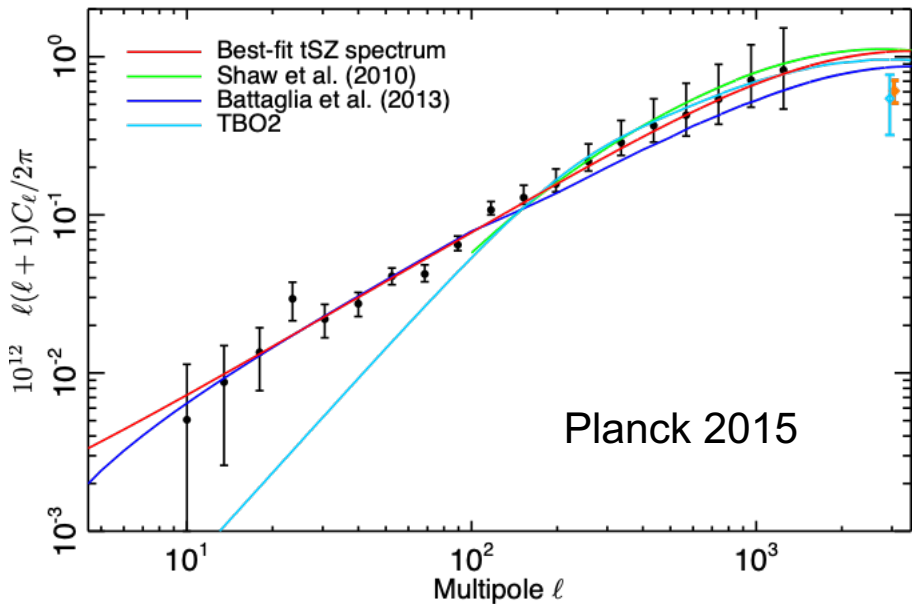
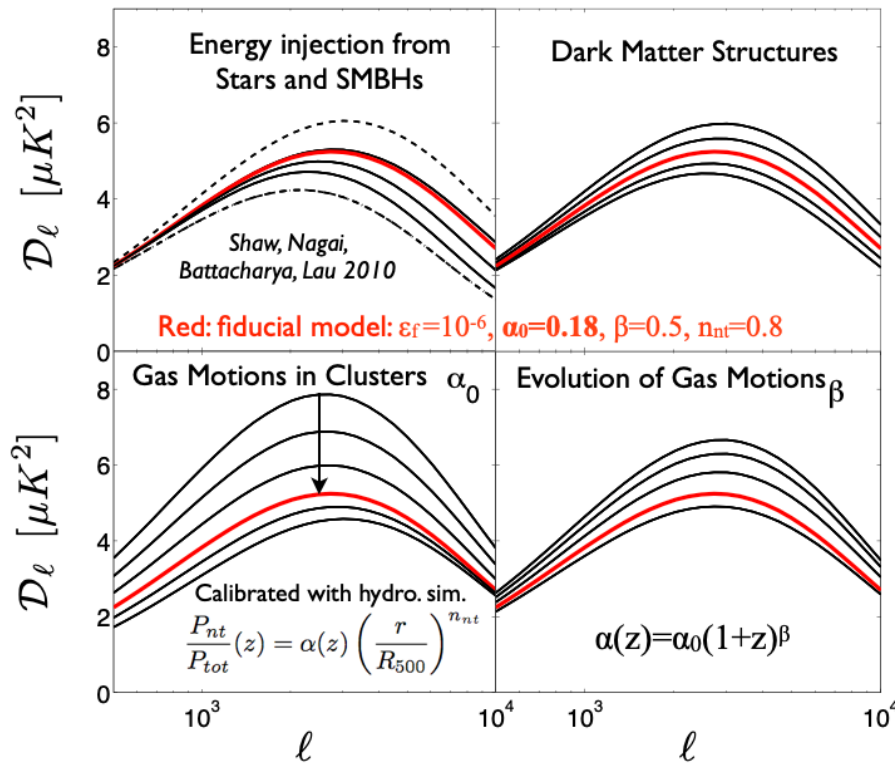


Vikhlinin+06, Sun+09, Lovisari+15:  
measurements of the **relation between mass of gas and total mass (DM+gas+stars)**

Baryon Pasting gas model describes X-ray observations (density profiles and gas mass) well  
(Flender, Nagai, McDonald+17)

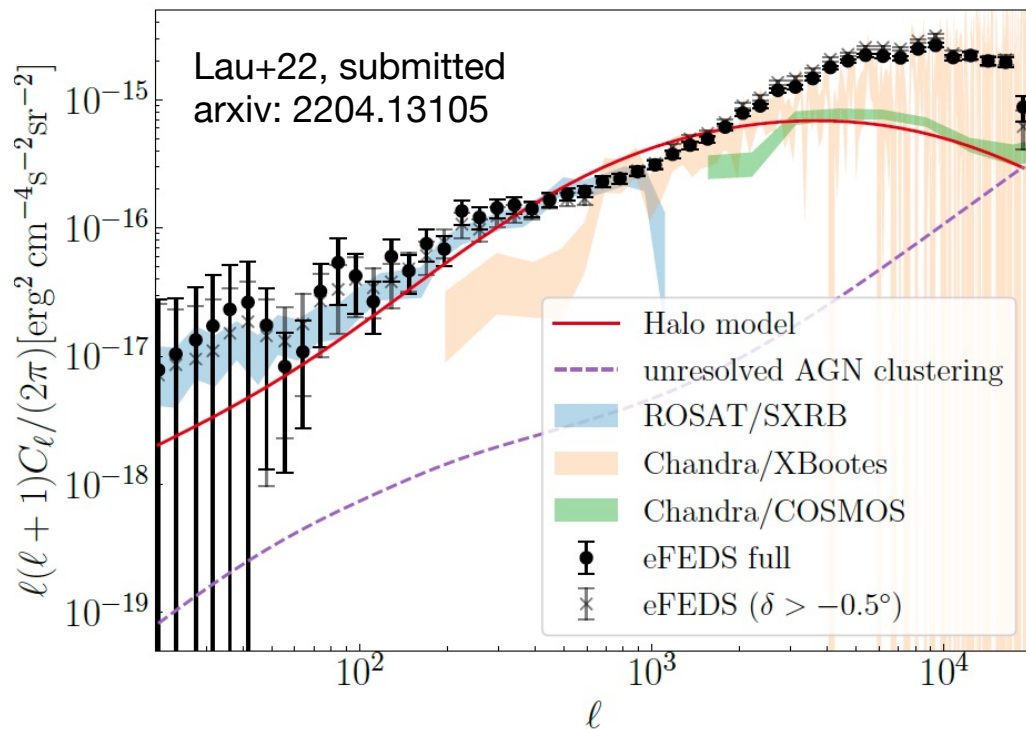
# BP Modeling of tSZ Power Spectrum

Thermal SZ power spectrum contains significant contributions from **outskirts of low mass** ( $M < 3 \times 10^{14} M_{\text{sun}}$ ), **high-z** ( $z > 1$ ) **groups** at  $l < 5000$



Planck measurements of the SZ power spectrum can constrain cluster astrophysics (especially **non-thermal pressure**)

# X-ray power spectrum of eFEDS field



- Large-scales ( $\ell < 2000$ ,  $\vartheta > 0.2^\circ$ ) - Consistent with **ROSAT** and the *Chandra* calibrated **BP model**.
- Small-scales ( $\ell > 2000$ ,  $\vartheta < 0.2^\circ$ ) - Large differences between **BP model** and *Chandra/COSMOS*
- Expected eROSITA All Sky Survey (eRASS1) cosmological constraint using only large angular scales ( $\ell < 2000$ ) - marginalized over astrophysics parameters:

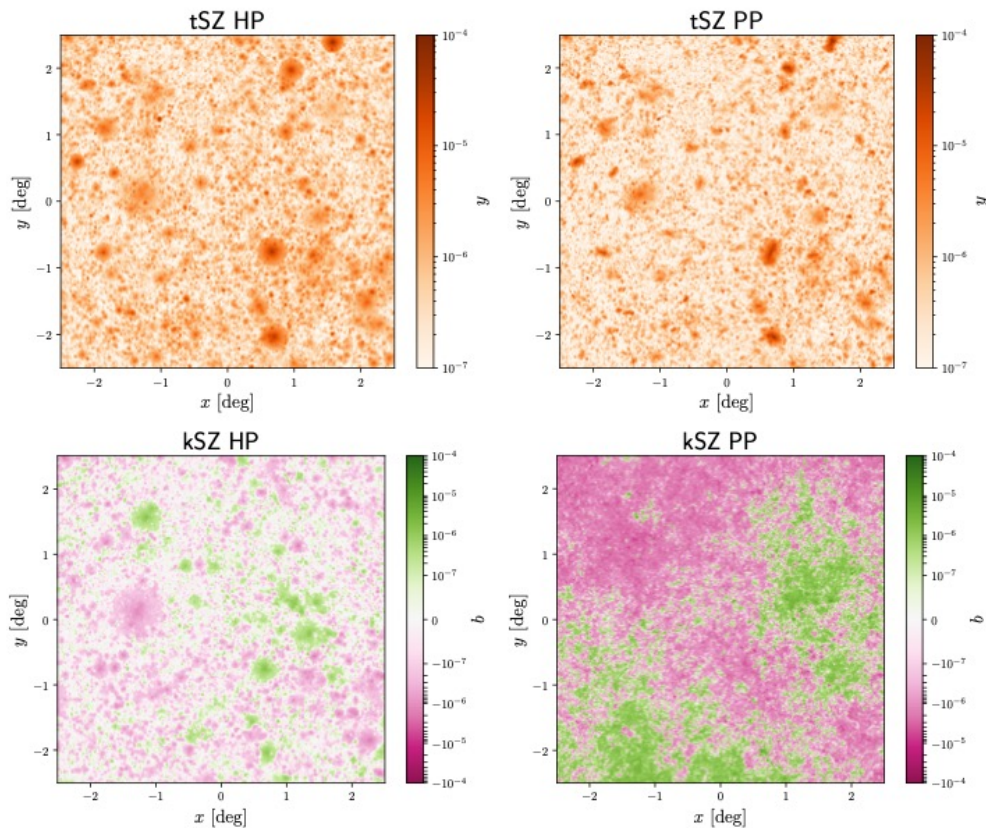
$$\Delta\Omega_M/\Omega_M \sim 5\%$$

$$\Delta\sigma_8/\sigma_8 \sim 4\%$$



# Baryon Pasting Algorithm

## Halo vs. Particle-based methods



Time / map

HP: 1.5 min

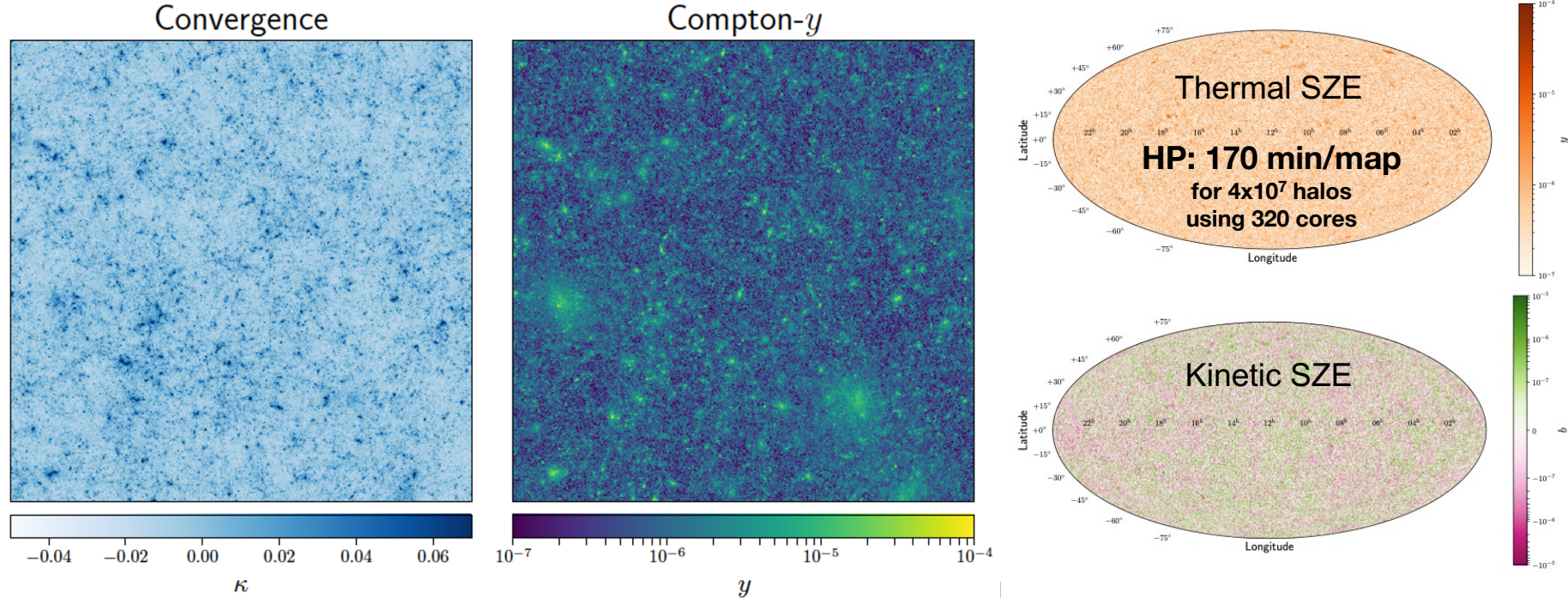
PP: 69 min

for  $5 \times 10^5$  halos  
using 224 cores

Osato & Nagai 2022  
(astro-ph/2201.02632)

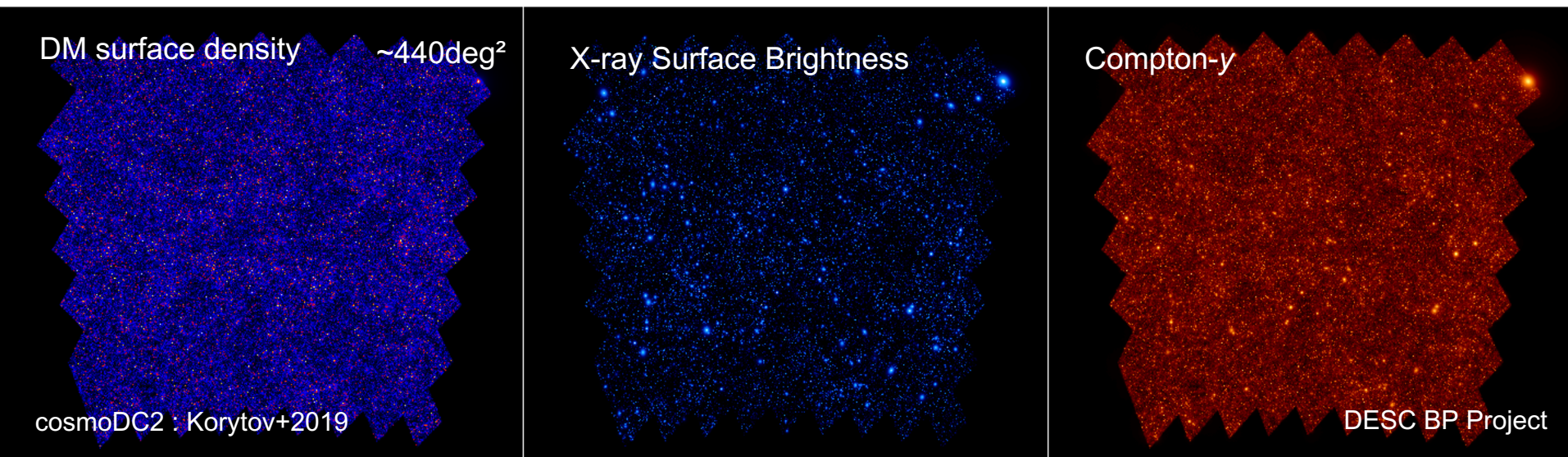
# All-Sky BP SZ Maps

108 full-sky lightcone simulations of CMB lensing (Takahashi+17) and tSZ (Osato & Nagai+22) maps



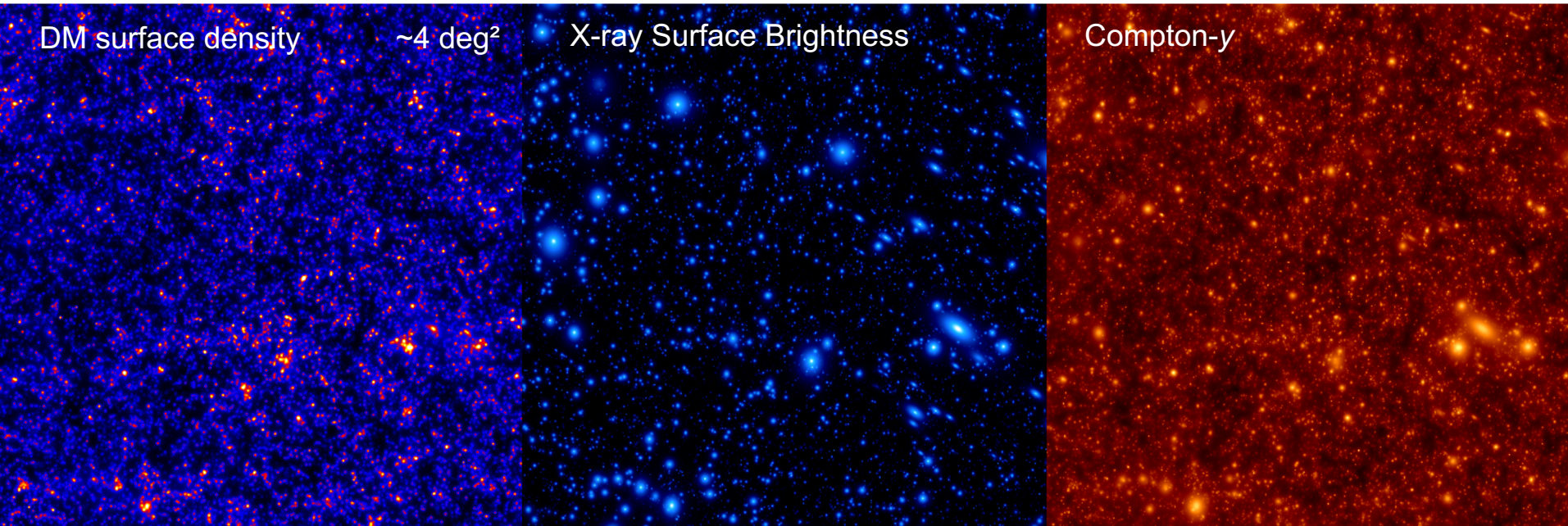
Next Step: Baryonification + tSZ x WL cross-correlation

# Baryon Pasted (BP) Multi-wavelength Maps



Halo-based painting: lensing, X-ray surface brightness, & compton y-maps of cosmoDC2 lightcones and Dark Quest simulations with and without aspherical DM halos and mis-centering

# BP x cosmoDC2 maps (Zoomed-in)



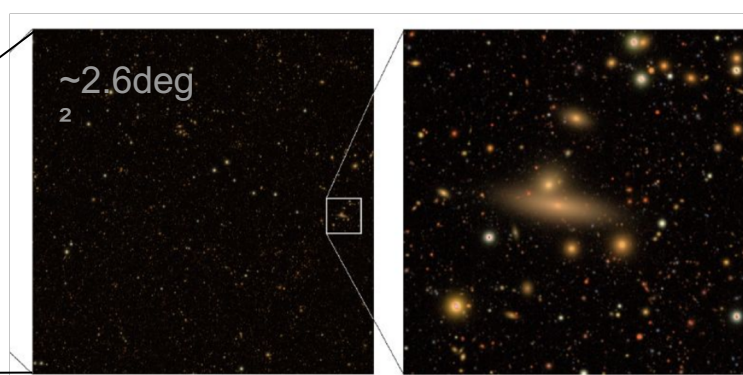
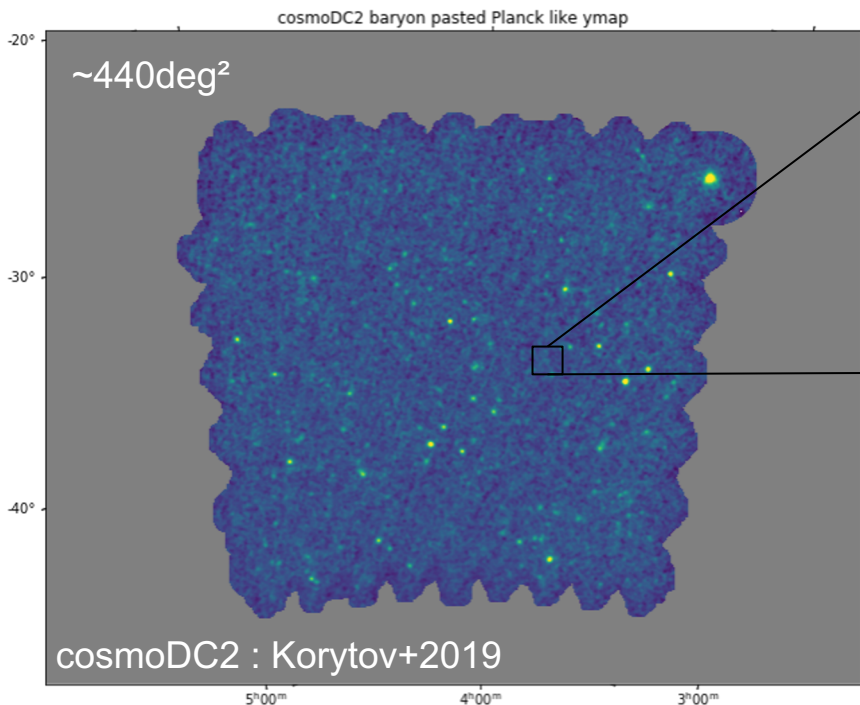
With Baryon Pasting we can:

- explore astrophysical systematics by varying parameters in the gas model
- capture projection effects, instrumental responses with BP-generated maps

# BP DESC Project

**Goal :** produce and analyse X-ray and SZ sky-maps corresponding to DESC sims with galaxy catalogs (redMAPPER) with cosmoDC2, and eventually SkySim5000, lightcone simulations

**Science Applications:** cluster scaling relations, cluster finders, selection functions, multi-wavelength cross-correlations

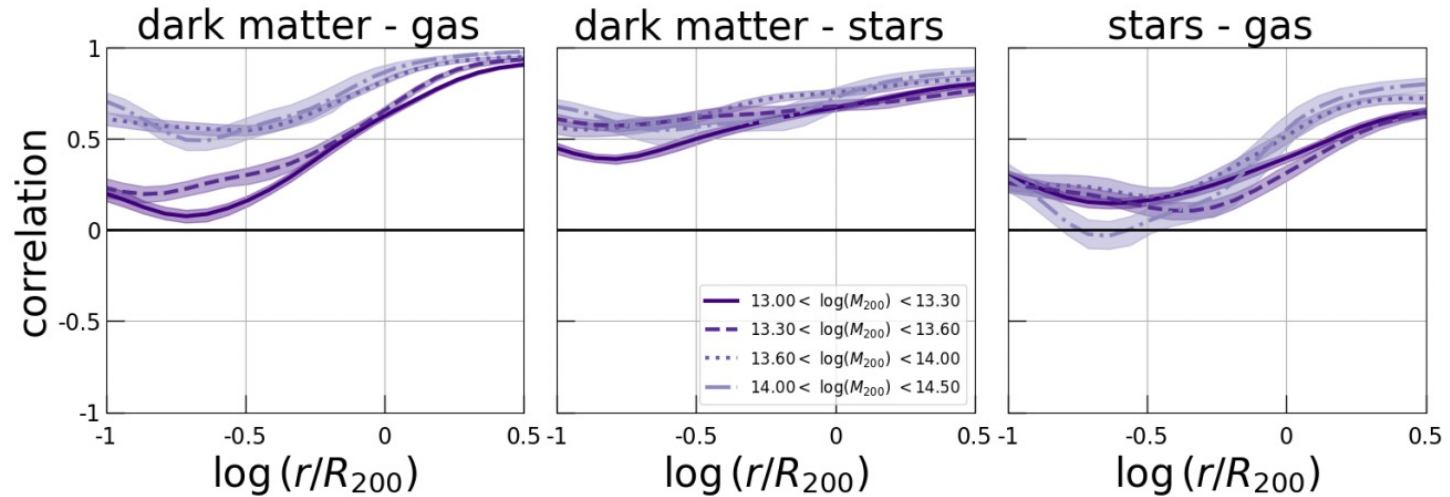
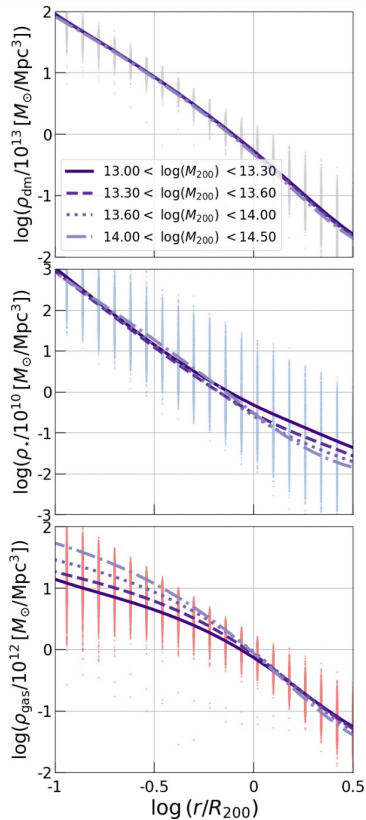


## Upcoming features in progress:

- Scatter & covariance in gas profiles
- Dependence on halo assembly history
- Particle-based painting for diffuse gas (incl. kSZ)
- Unified model of DM halo-gas-galaxies

# Towards Forward-Modeling Covariances

## Correlated Structures of Dark Matter, Gas & Stellar Profiles



- Correlations between scatter of DM, stars, and gas density profiles in Illustris-TNG300 simulations is scale dependent and can potentially be used as a probe of astrophysics.
- These covariance matrices are a source of systematics in cluster mass calibration.

Unpublished

SHOW DETAILS



EDIT THEME



PUB SETTINGS



SHARING



CITE



DOWNLOAD



CONTENTS



# Galactic Gaseous Halos: Mini-Clusters Disrupted by Feedback

Hot gaseous halos around galaxies are mainly the realm of theoretical exploration which will soon change.

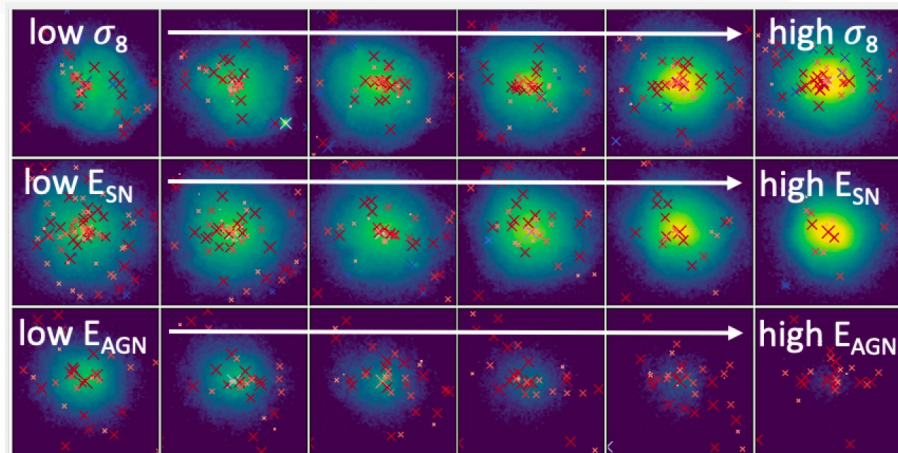
by Priyanka Singh, Daisuke Nagai, Benjamin D. Oppenheimer, Erwin Lau, Naomi Gluck, and Isabel Medlock



**Goals:** Study the variation of X-ray properties and galaxies using **CAMELS** - a suite 4,233 cosmological simulations: 2,049 N-body and 2,184 MHD with TNG and SIMBA subgrid model (Public Data Release in Jan 2022: Villaescusa-Navarro et al. 2022)

**Right-panel figure:** CAMELS variations on cosmological and astrophysical parameters of X-ray luminosity and galaxies in the same group sized halos.

Supported by the NSF-AST Grant 2206055



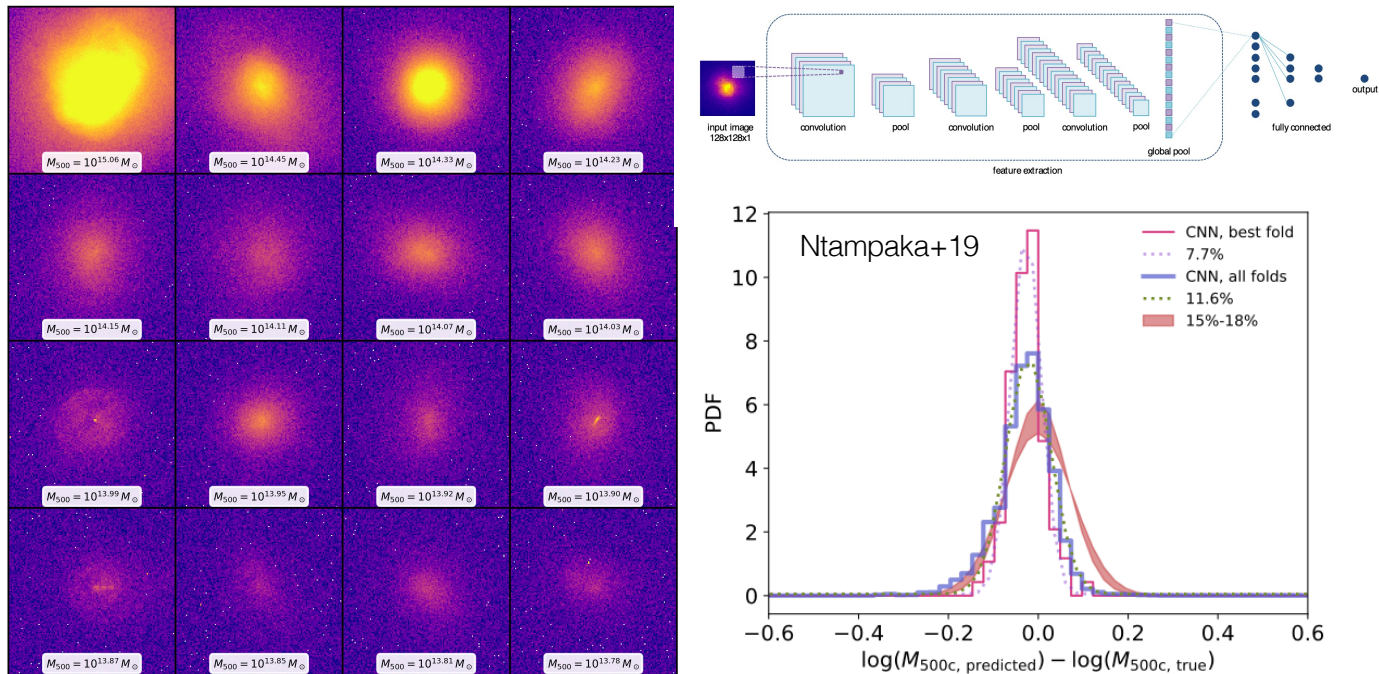
# ***Machine Learning Frontier***

*discover new features in large simulation datasets and  
model large observational dataset using **machine learning***



# A Deep Learning Approach for Weighting the Giants

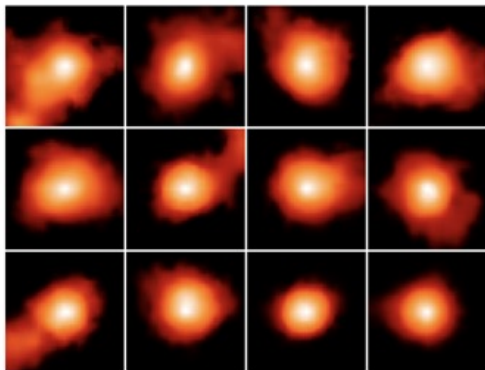
Mock X-ray images of 329 clusters with  $M_{500c} \geq 10^{13.6} M_{\text{sun}}$ , augmented with many viewing angles of each cluster from the Illustris TNG-300 simulation



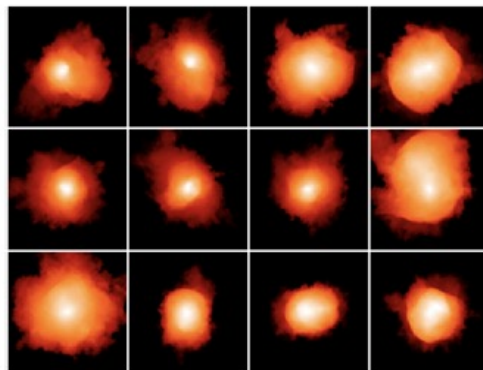
The ML-based X-ray cluster mass has a small scatter of 8-12%, which is a significant improvement from 15-18% scatter based on the core-excised X-ray luminosity - the current market standard.

# Emulating SZ Images using Auto-Encoder

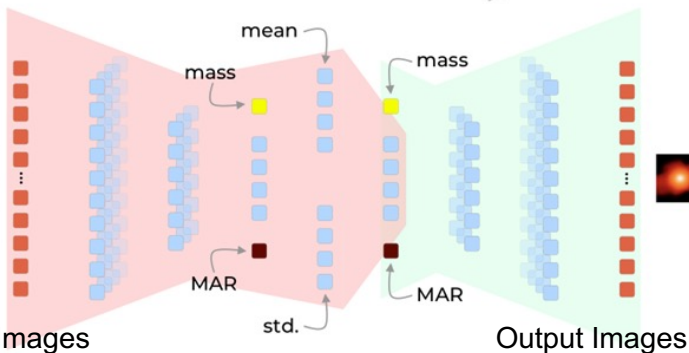
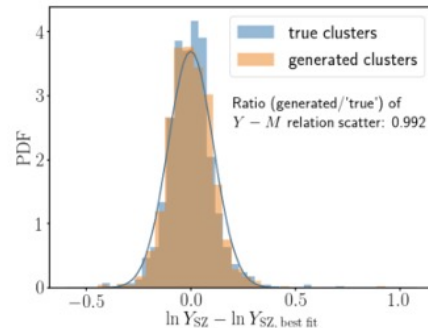
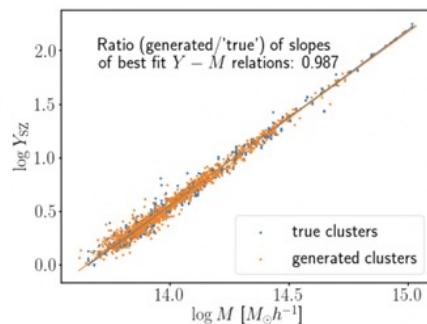
Generated images by the auto-encoder



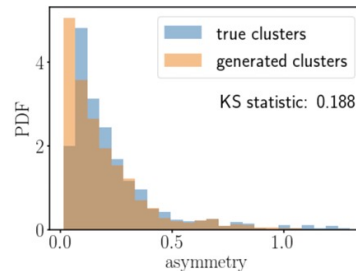
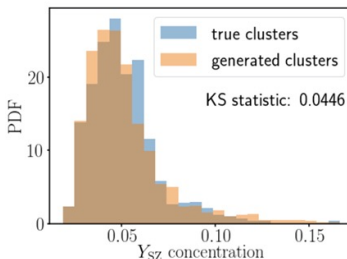
Original images from TNG-300



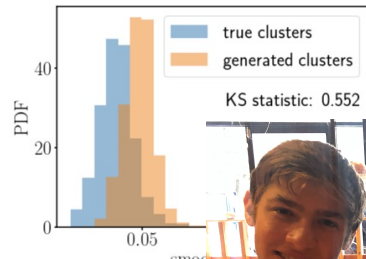
### Reproducing $Y_{SZ}$ - $M$ relation & scatter



### Reproducing $Y_{SZ}$ concentration & asymmetry



### Imperfection: Smoothness



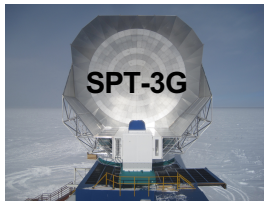
# Towards Precision Modeling of ICM Physics

X-ray



eRosita

Microwave



AdvACT



Optical



LSST



## Opportunity

Multi-wavelength cosmological surveys promise to constrain the warm-hot gas in galaxies, groups, and clusters using X-ray, SZ effects, and galaxies.

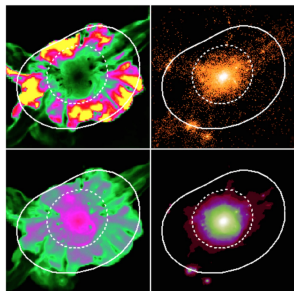
## New Tools

1. **Computational:** gain physical insights into SZ astrophysics from *hydrodynamical cosmological simulations*
2. **Modeling:** develop of a *physically-motivated, computationally efficient model* of pressure and gas density profiles for WL-SZ cross-correlations
3. **Data-Driven:** extract more from large simulation & observational data using *machine learning*

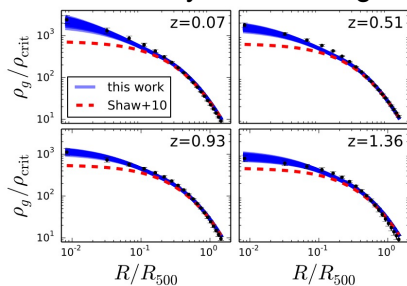
## Outstanding Challenges

1. **Cluster Astrophysics:** feedback, non-thermal pressure, gas shape, accretion shock, & plasma effects
2. **SZ+X-ray profile modeling:** Halo-Gas connection, Covariance, Beyond profile with generative model

Computer Simulation



Analytical Modeling



Machine Learning

