



# Galaxy Cluster Cosmology:

*High-angular resolution follow-up studies in X-ray and SZ*

FLORIAN RUPPIN

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*In collaboration with: The NIKA2, the MaDCoWS, and the SPT cluster teams*



## **Galaxy cluster cosmology**

*Cluster observables and cosmological analysis*

## **Mass - Observable scaling relation**

*Systematic effects and cosmological impacts*

## **Mass functions from simulations**

*Systematic effects and observational constraints*



# **Galaxy cluster cosmology**

*Cluster observables and cosmological analysis*

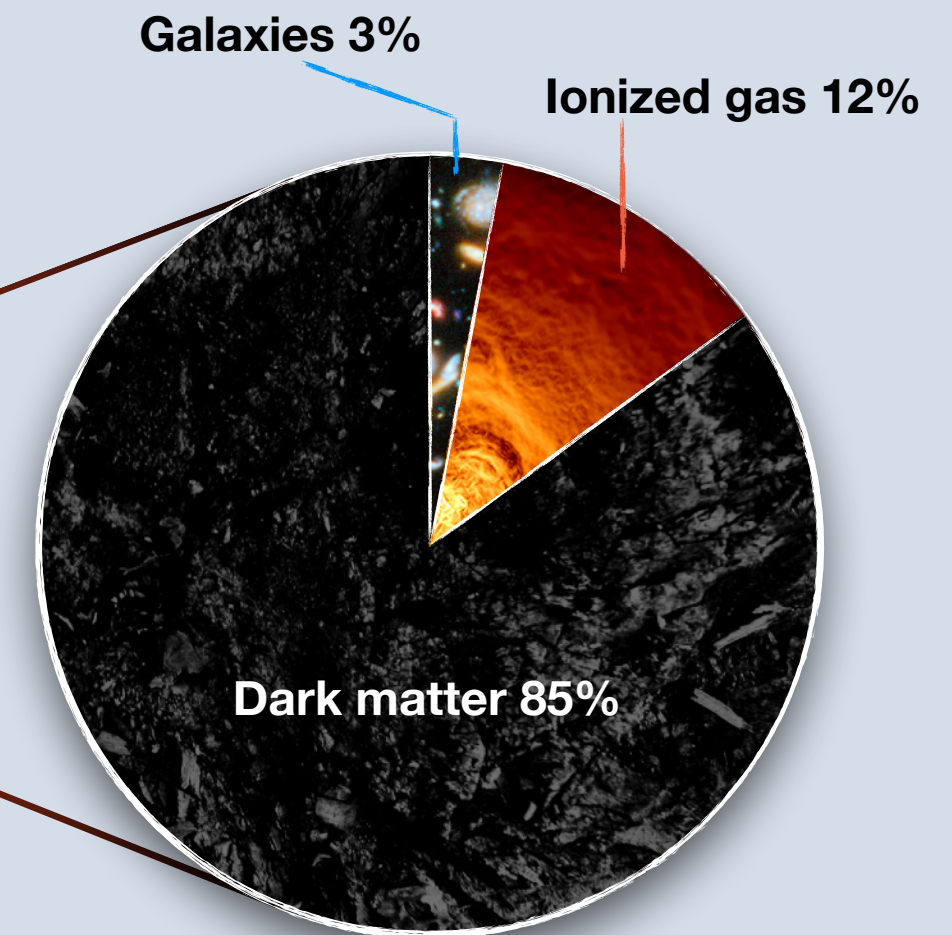
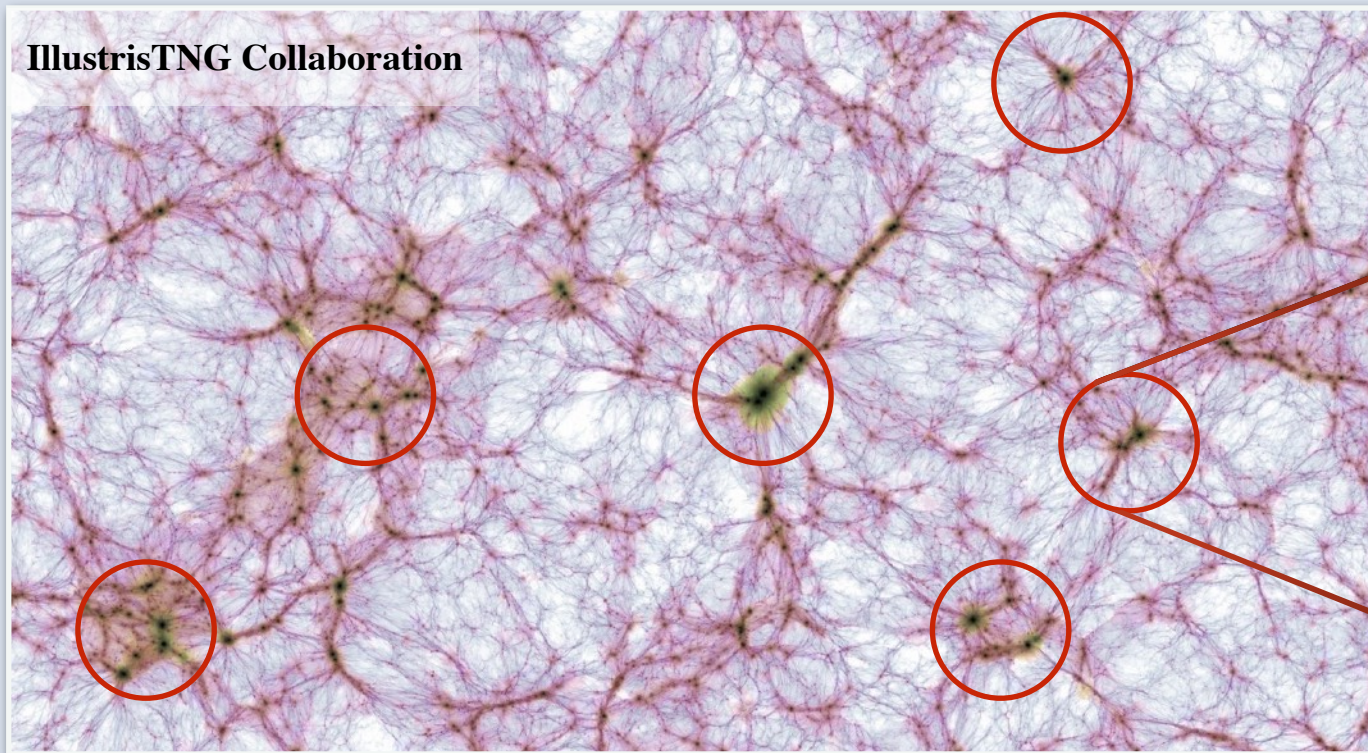
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*Systematic effects and cosmological impacts*

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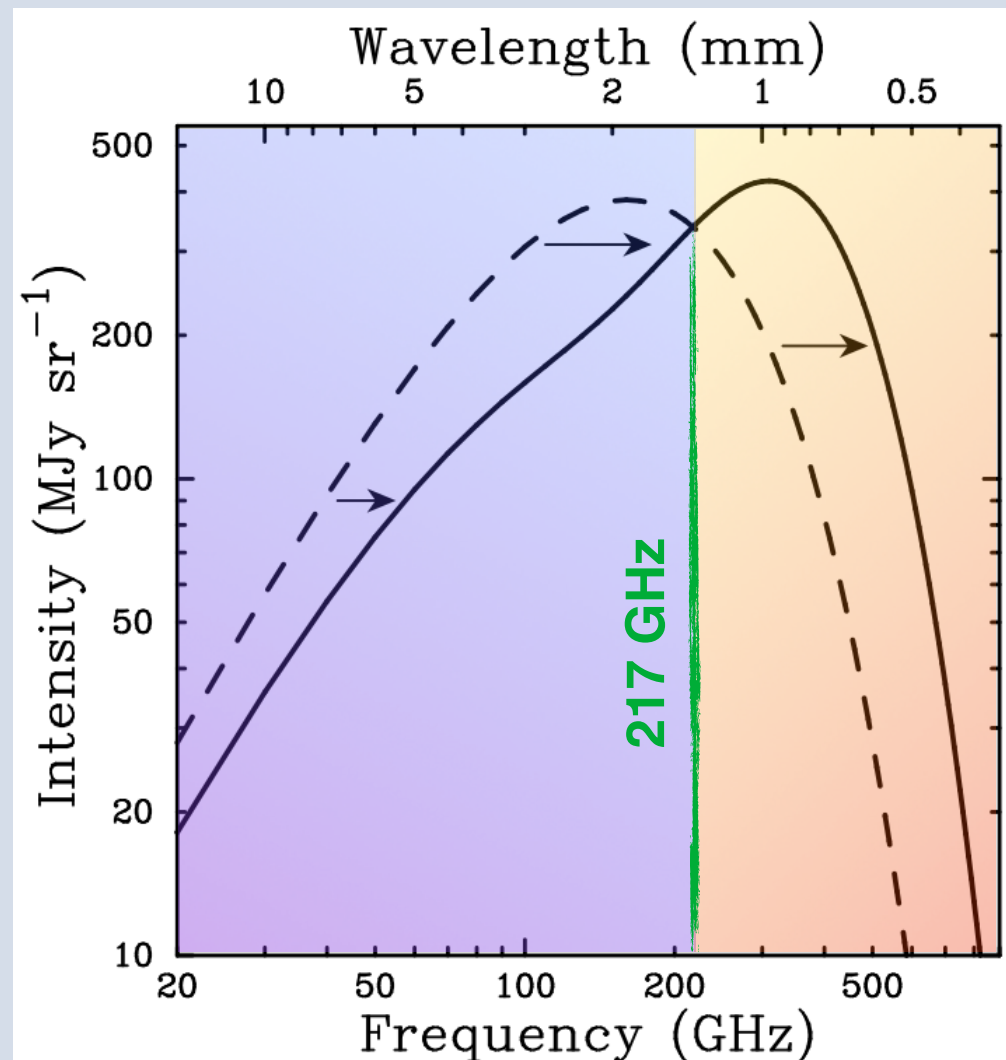
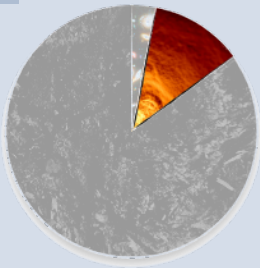
# Clusters of Galaxies



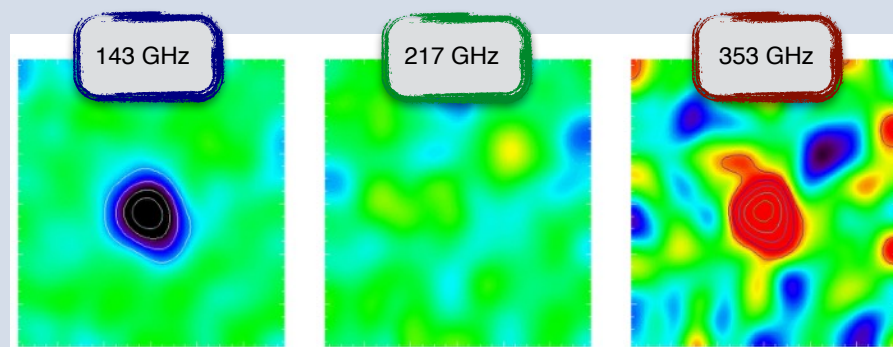
- **Clusters of Galaxies**

- Largest gravitationally bound structures in the Universe
- Dominated by dark matter
- Intra-Cluster Medium (**ICM**) :  
Hot ionized gas  $\sim 5 - 10$  keV
- Total mass:  $M_{\text{tot}} \sim 10^{14} - 10^{15} M_{\odot}$
- Typical redshift:  $z \in [0, 3]$

# Galaxy cluster observables: SZ effect



Carlstrom *et al.* ARA&A (2002)



A 2319  
(Planck)

- **Sunyaev-Zel'dovich effect (SZ)**

Sunyaev & Zel'dovich CoASP (1972)

Compton scattering of CMB photons by high-energy ICM electrons

→ CMB photons gain energy

CMB spectral distortion

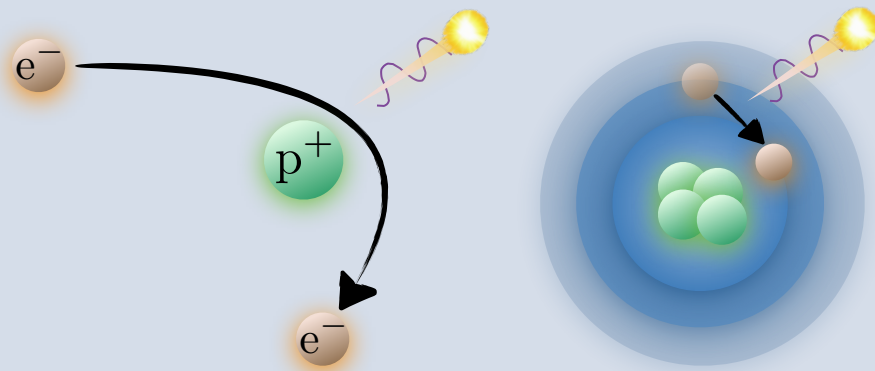
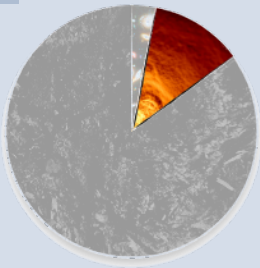
→ SZ effect is **redshift independent**

**SZ effect Amplitude** : Compton parameter

$$y_{\text{SZ}} \propto \int P_e dl \rightarrow \text{ICM electronic Pressure}$$



# Galaxy cluster observables: X-ray emission



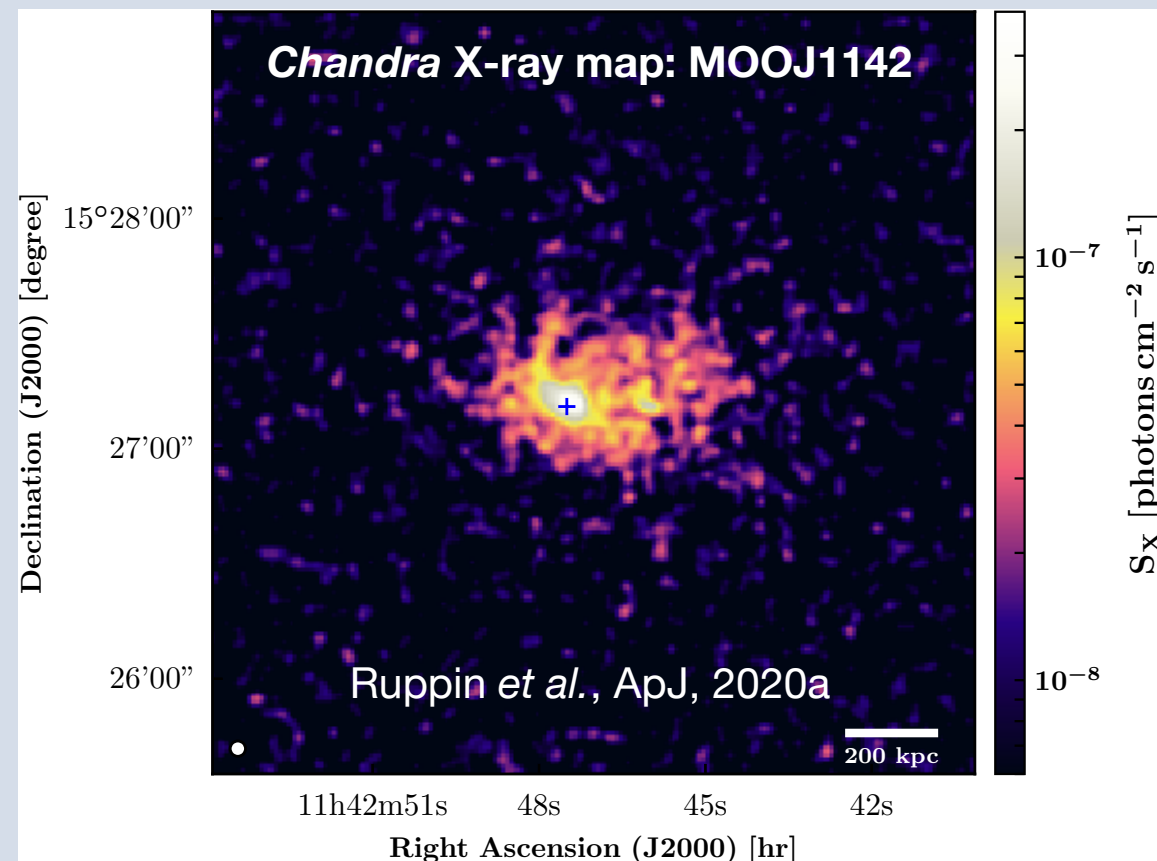
## • X-ray emission

Bremsstrahlung emission induced by hot ICM electrons

→ Continuous spectrum

Change of electron quantum state in heavy elements

→ Emission lines



X-ray surface brightness:  $S_X \propto \int n_e^2 \Lambda(T_e, Z) dl$

→ ICM electron **Density** and **Temperature**

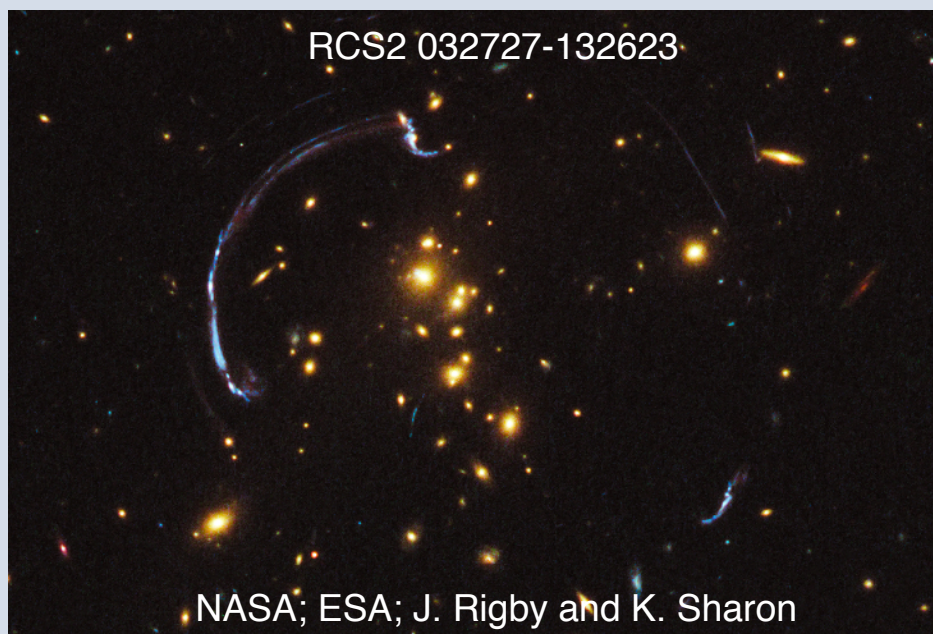
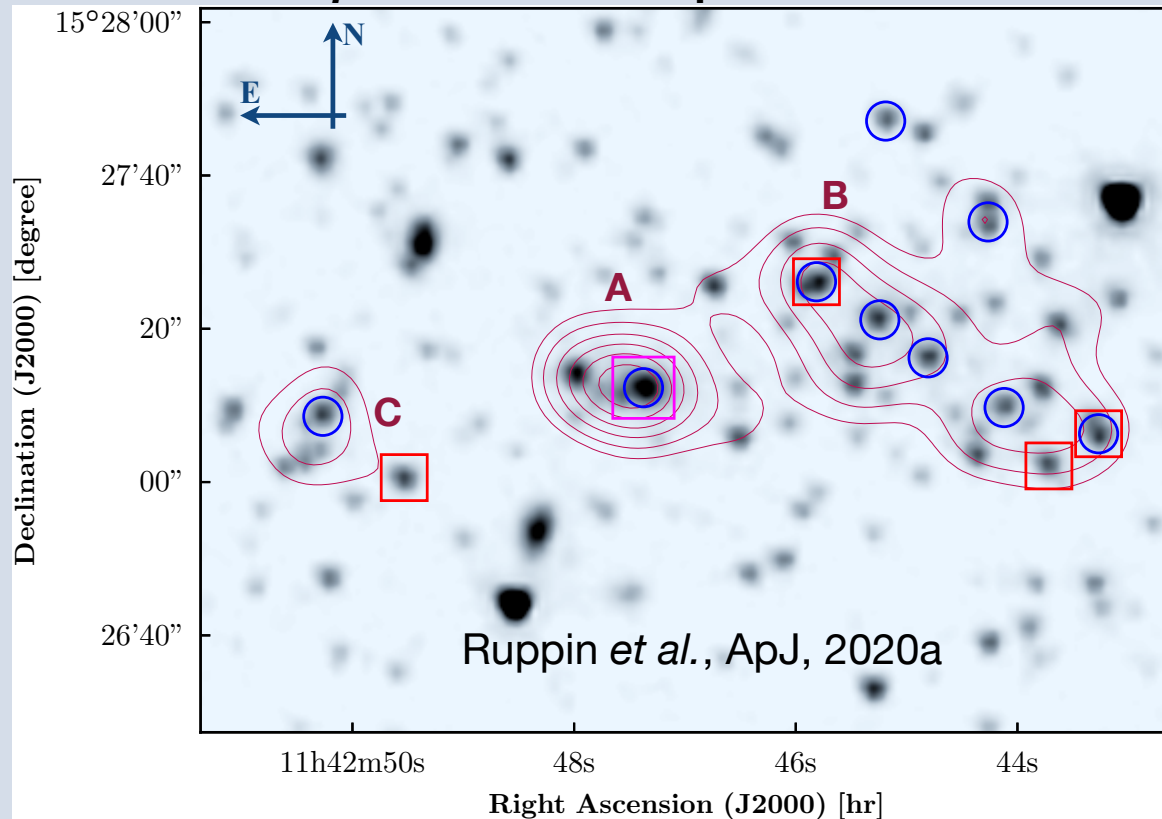
Hydrostatic mass: combination of **Pressure** / **Density**

$$M_{HSE}(r) \propto \underbrace{\frac{r^2}{n_e(r)}}_{\text{X-rays}} \times \frac{\overset{\text{SZ effect}}{d P_e(r)}}{dr}$$



# Galaxy cluster observables: optical/IR emission

Spitzer infrared map: MOOJ1142



- **Optical/IR emission**

Light coming from stars and interstellar medium

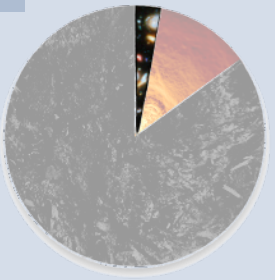
→ Continuous spectrum + emission / absorption lines

Best observable to know cluster redshift  
(essential for cosmology / astrophysics)

Galaxy distribution of cluster members  
(very useful to study merger dynamics)

Gravitational lensing

→ Matter distribution + cluster **total mass**



# Cosmology with galaxy clusters

## Large galaxy cluster survey

- Catalog of detected clusters:
  - observable  $\mathcal{O}_{500}$
  - signal-to-noise  $\xi_m$
  - mass  $M_{500}$
  - redshift  $z$
  - position  $(l, b)$
- Abundance of clusters in bins of **observable** and **redshift**  $\frac{d^2 N}{d\mathcal{O}_{500} dz}$
- Examples of surveys : **in SZ** with *Planck*, SPT, ACT  
**in X-ray** with eROSITA  
**in optical/IR** with *Euclid* and the Rubin Observatory

Large number of galaxy clusters to do **cosmology**

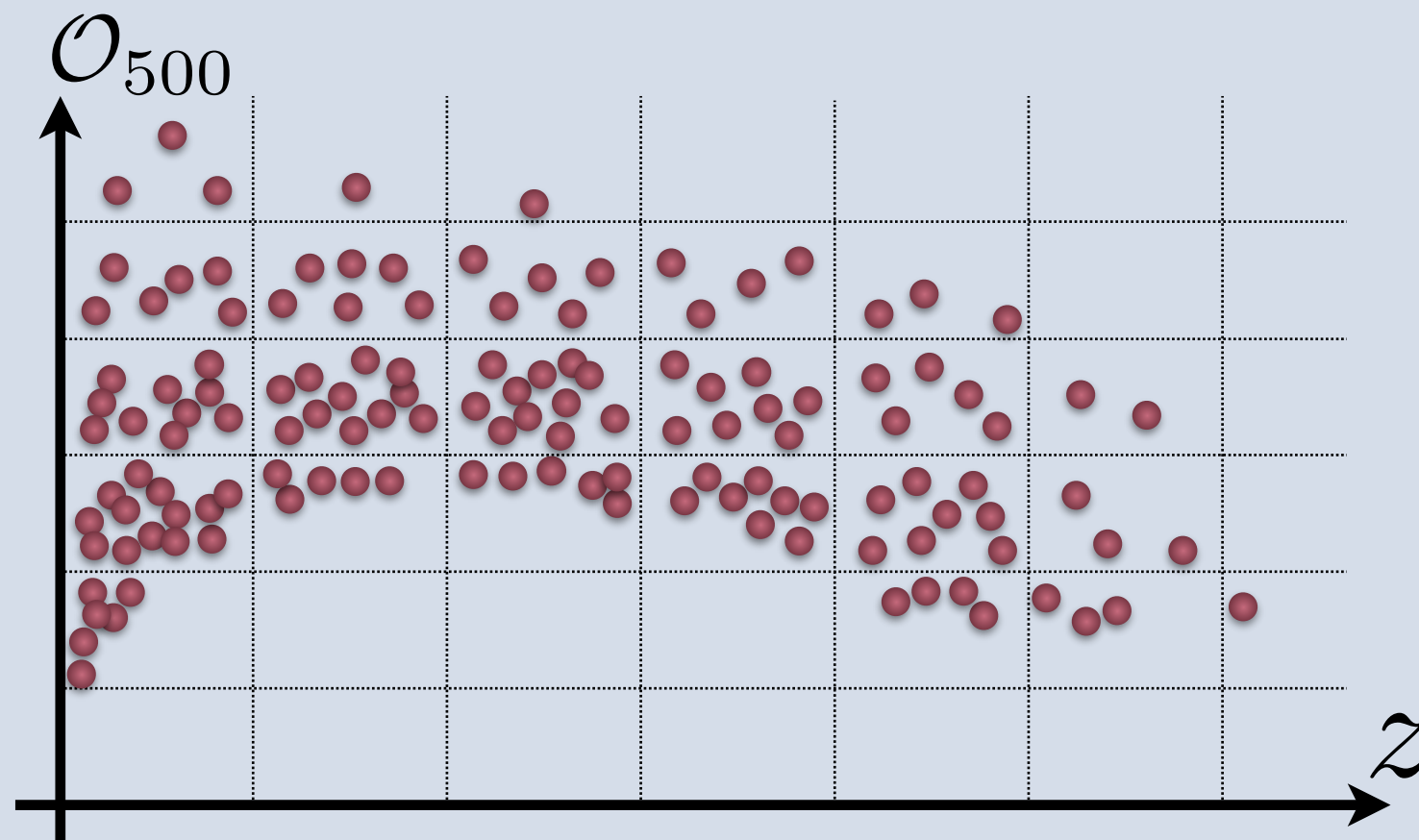
# Cosmology with galaxy clusters

**Expected cluster abundance:**

*Per unit of mass and redshift*

$$\frac{d^2 N}{dM_{500} dz} (\xi > \xi_{\text{cat}}) = \int d\Omega \int d\mathcal{O}_{500} \int_{\xi_{\text{cat}}}^{\infty} d\xi \underbrace{P[\xi | \xi_m(\mathcal{O}_{500}, l, b)]}_{\text{Selection function}} \underbrace{P[\mathcal{O}_{500} | z, M_{500}]}_{\text{Mass-Observable scaling relation}} \underbrace{\frac{d^2 V}{dz d\Omega}}_{\text{Comoving volume}} \underbrace{\frac{dn}{dM_{500}}}_{\text{Mass function}}$$

Probability to detect a cluster



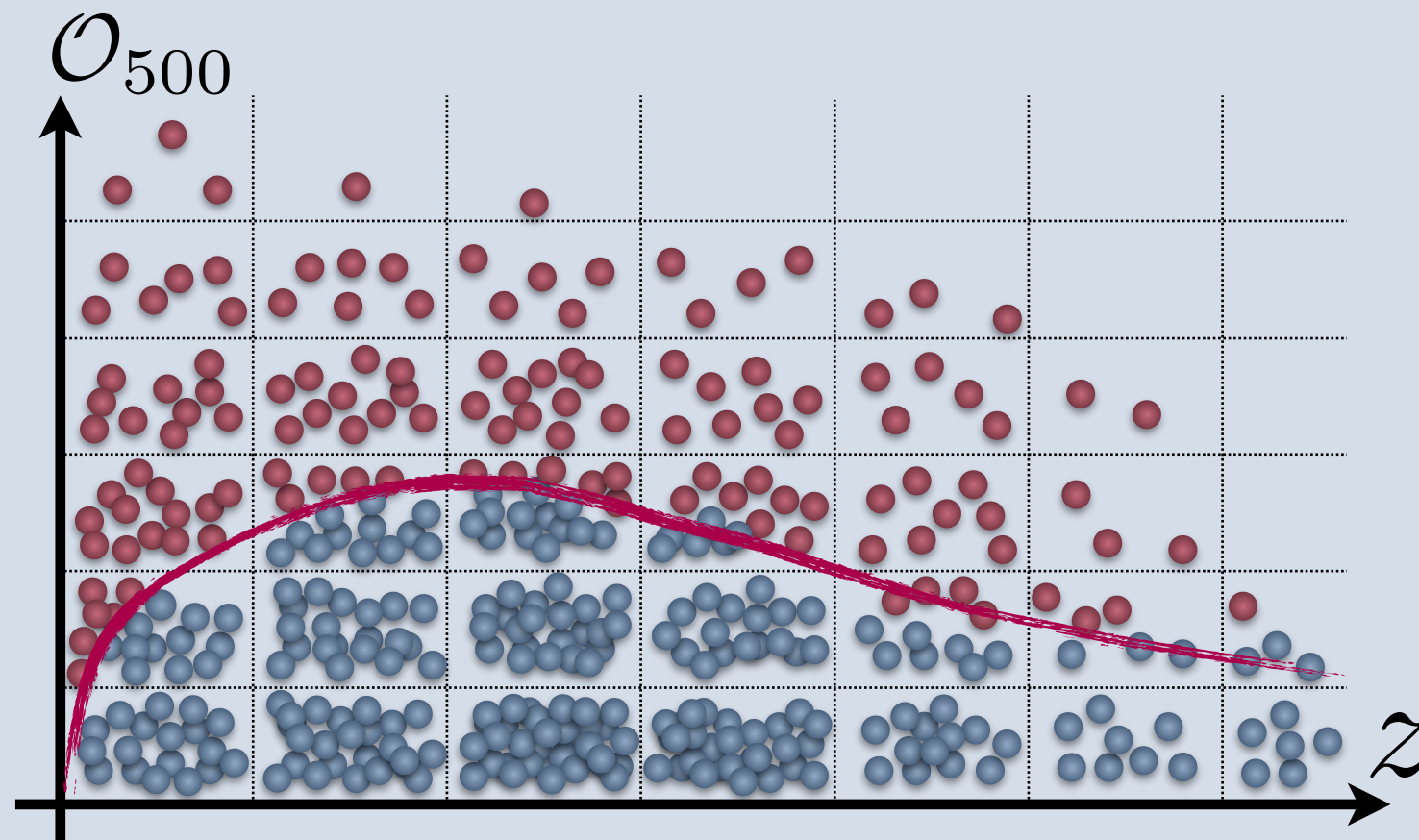
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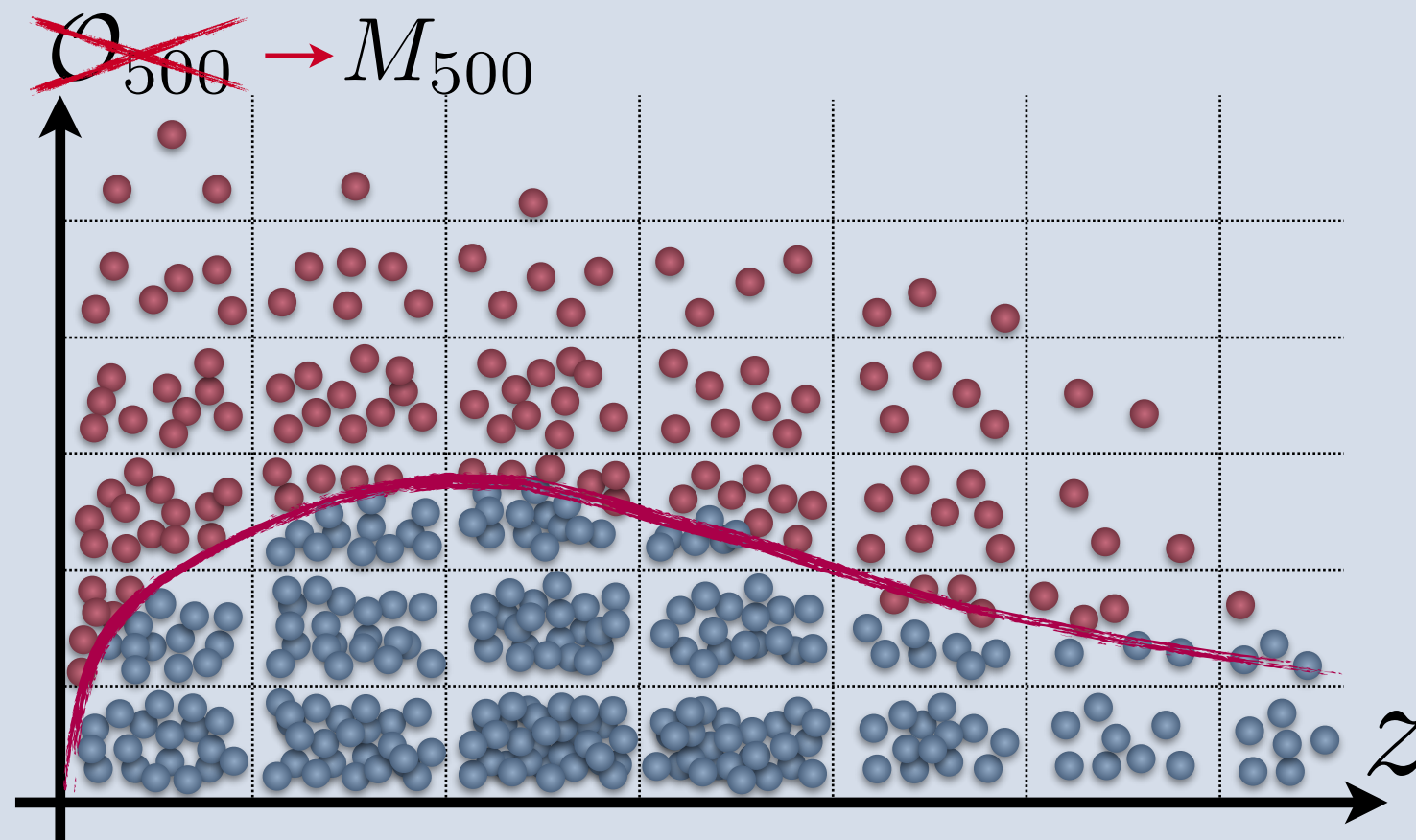


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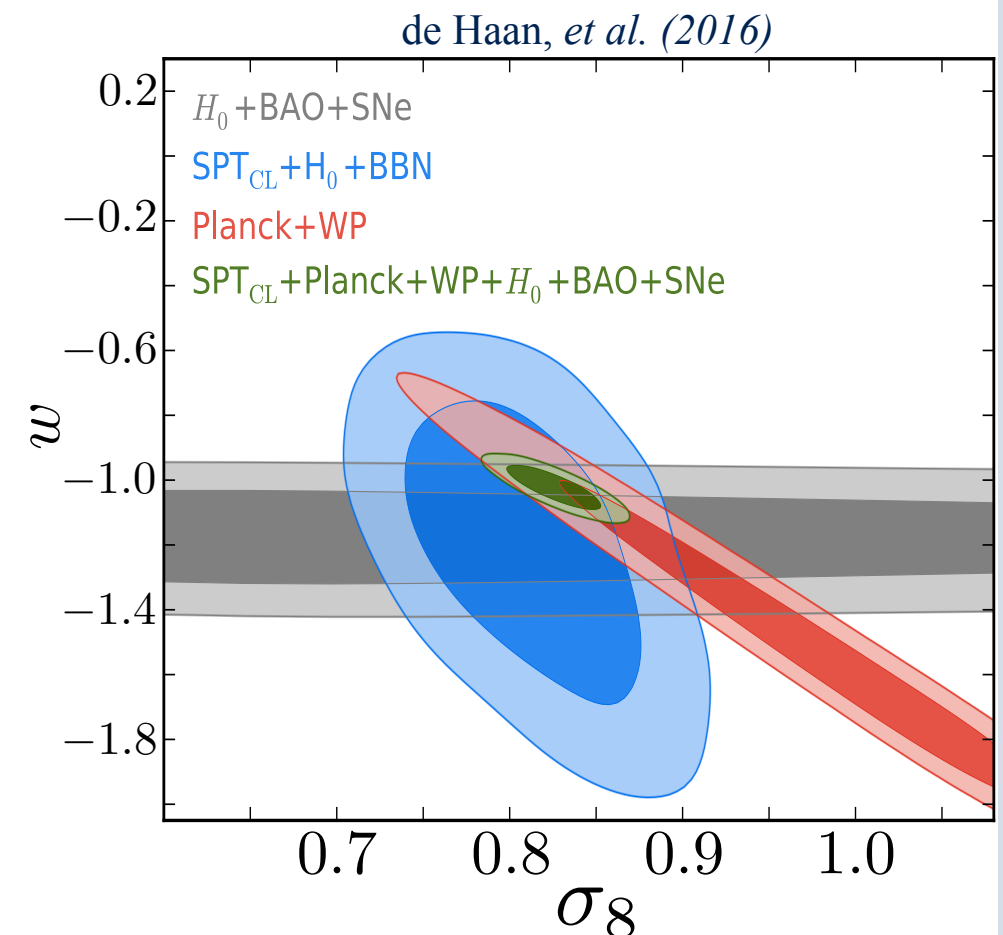
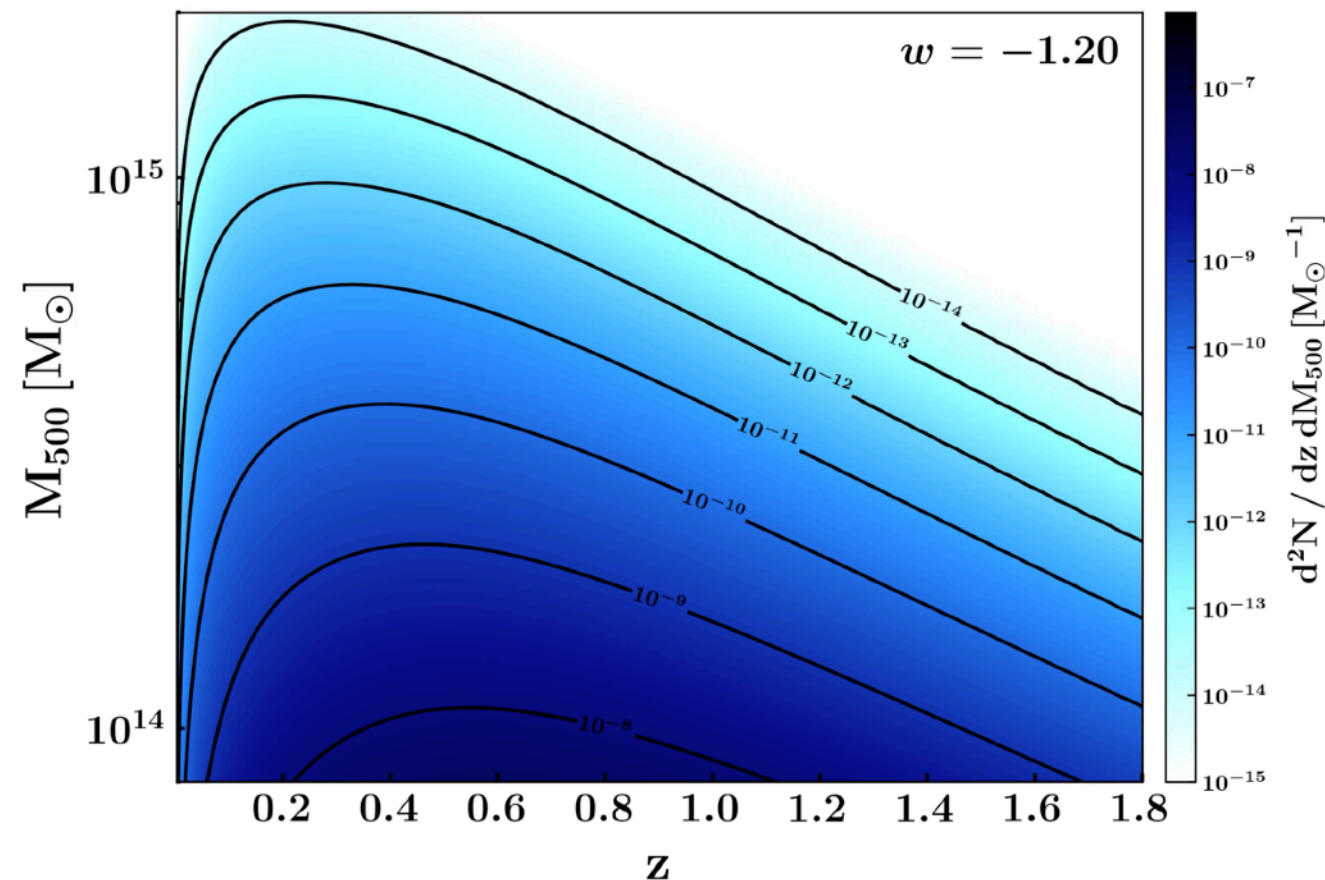
Selection  
function

Mass-Observable  
scaling relation

Comoving  
volume

Mass  
function

Depends on cosmological parameters  $\sigma_8, \Omega_m, H_0, w, N_{eff}, \sum m_\nu, f_{NL}$



# Cosmology with galaxy clusters

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*Per unit of mass and redshift*

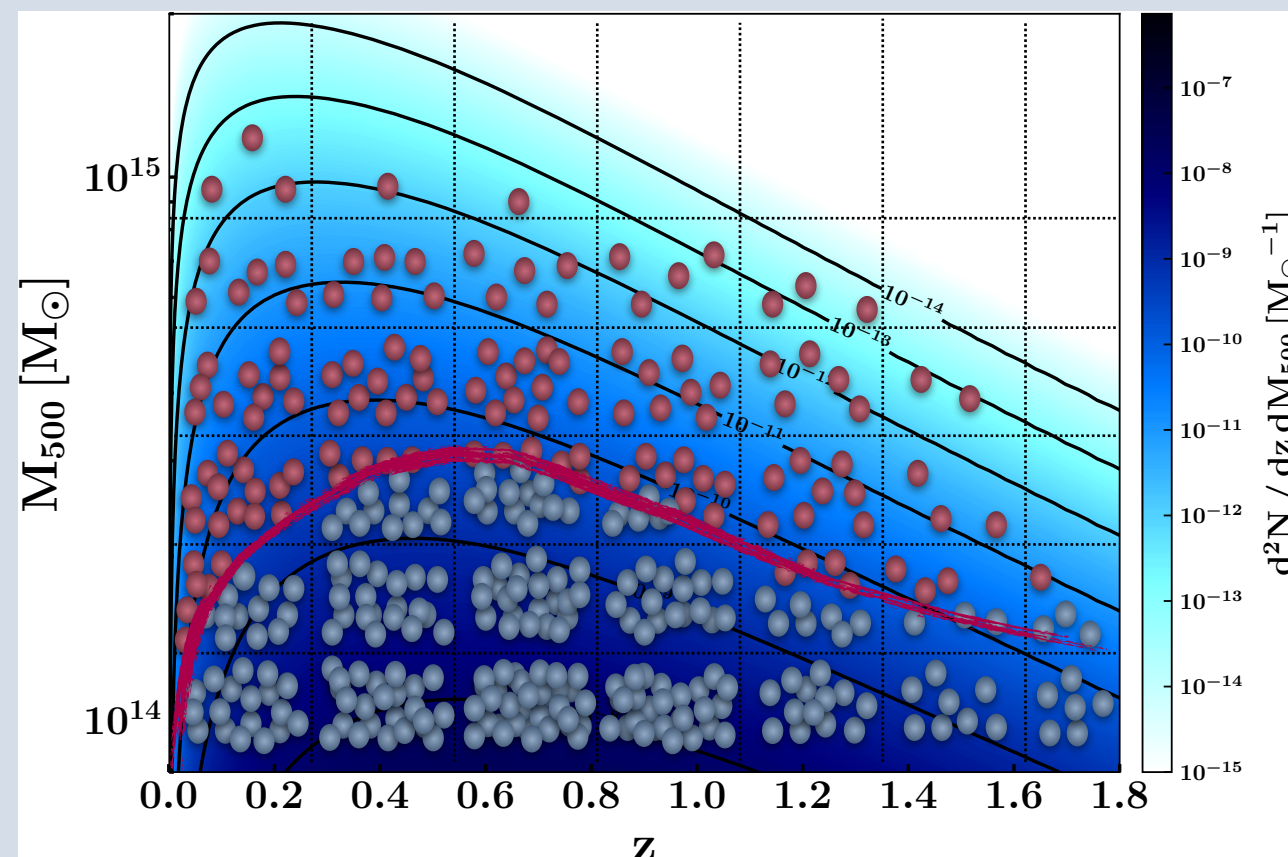
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Systematic uncertainties for each element in  $\frac{d^2 N}{dM_{500} dz} (\xi > \xi_{\text{cat}})$

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# Systematics on the SZ-mass scaling relation

Scaling relation:

$$P[\mathcal{O}_{500}|z, M_{500}]$$

- SZ observable: integrated Compton parameter  $Y_{500} \propto \int_0^{R_{500}} P_e d^3r$

SZ survey

Observable:  $Y_{500}$

Mass:  $M_{500}$

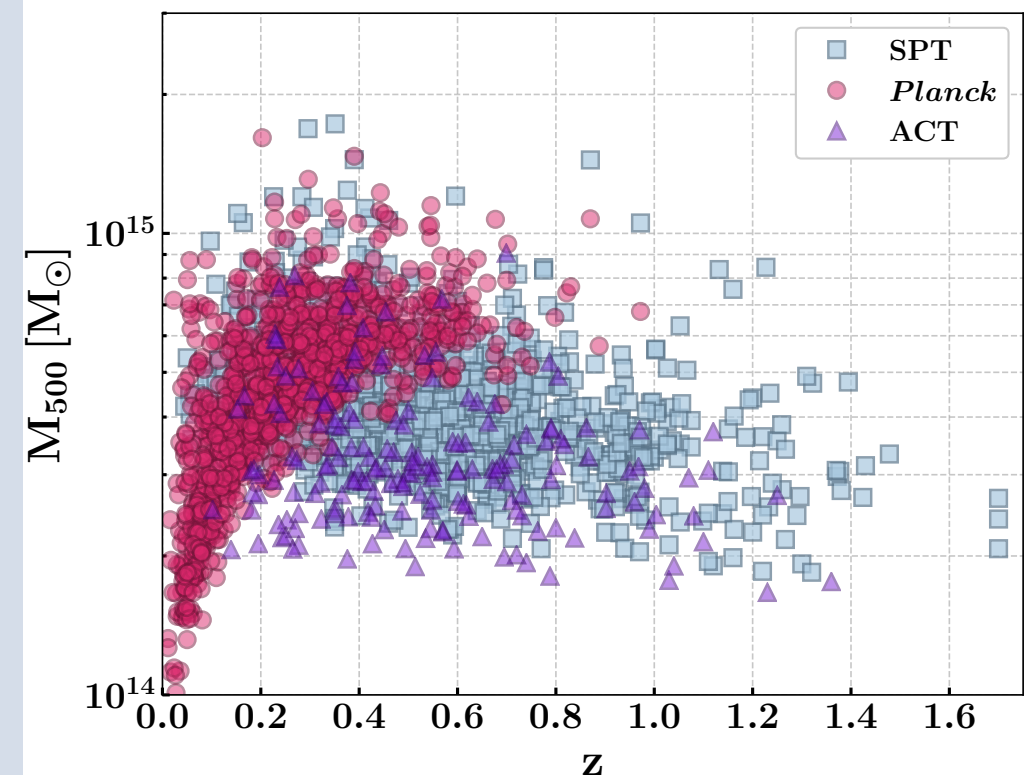
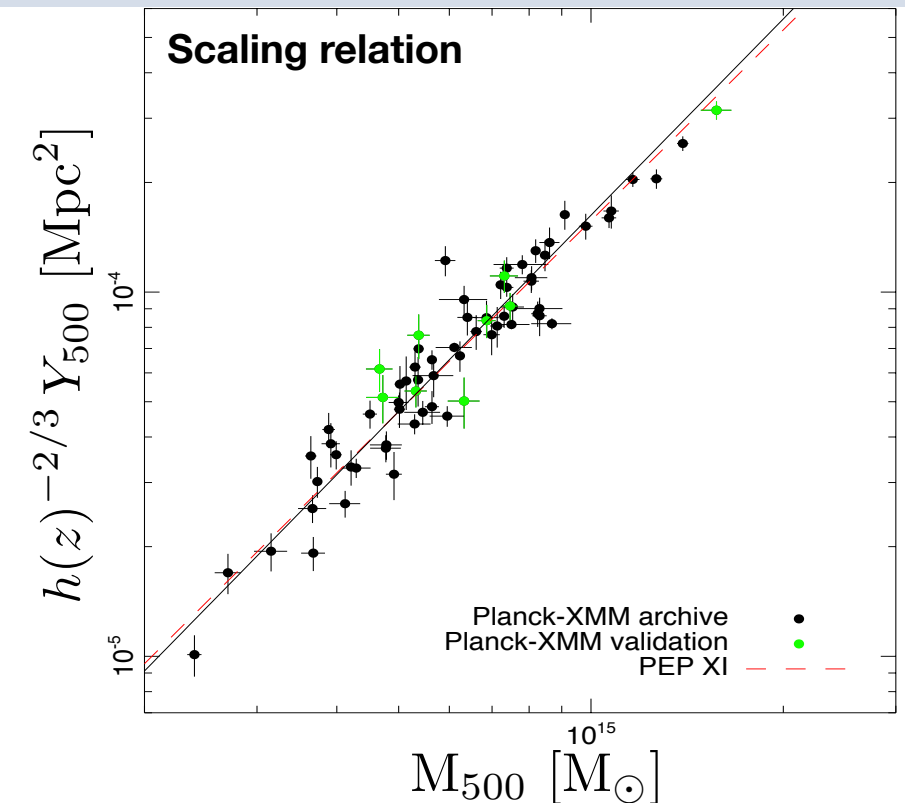
Mean pressure profile

Scaling relation

Main ingredients: **pressure profile** and **scaling relation**

- Calibration of *current* scaling relations:**
  - **low-redshift** cluster samples ( $z < 0.5$ )
- Self-similar assumption:** cluster = scaled objects
  - Main ingredients considered for **entire cluster population**

**Redshift / Mass evolution** of cluster properties?



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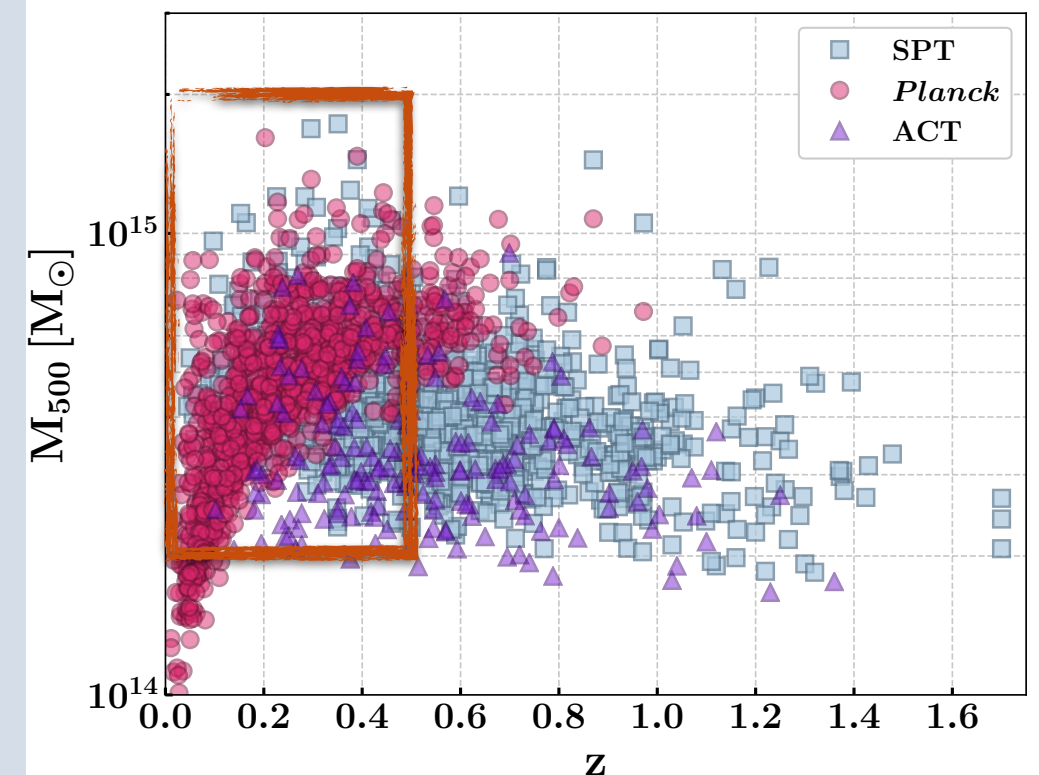
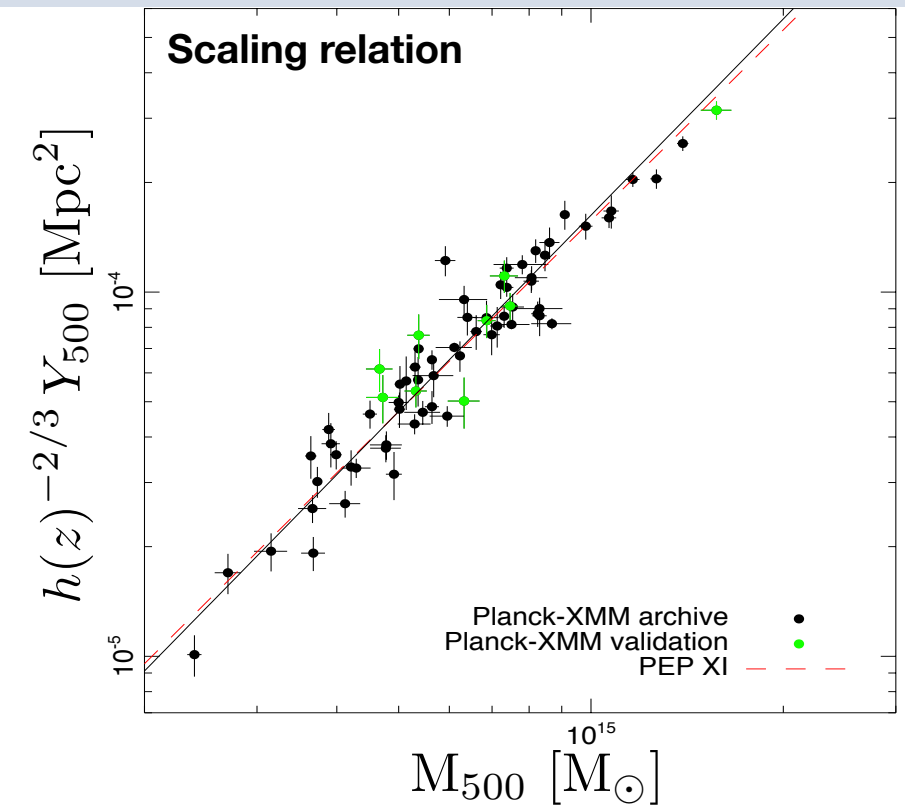
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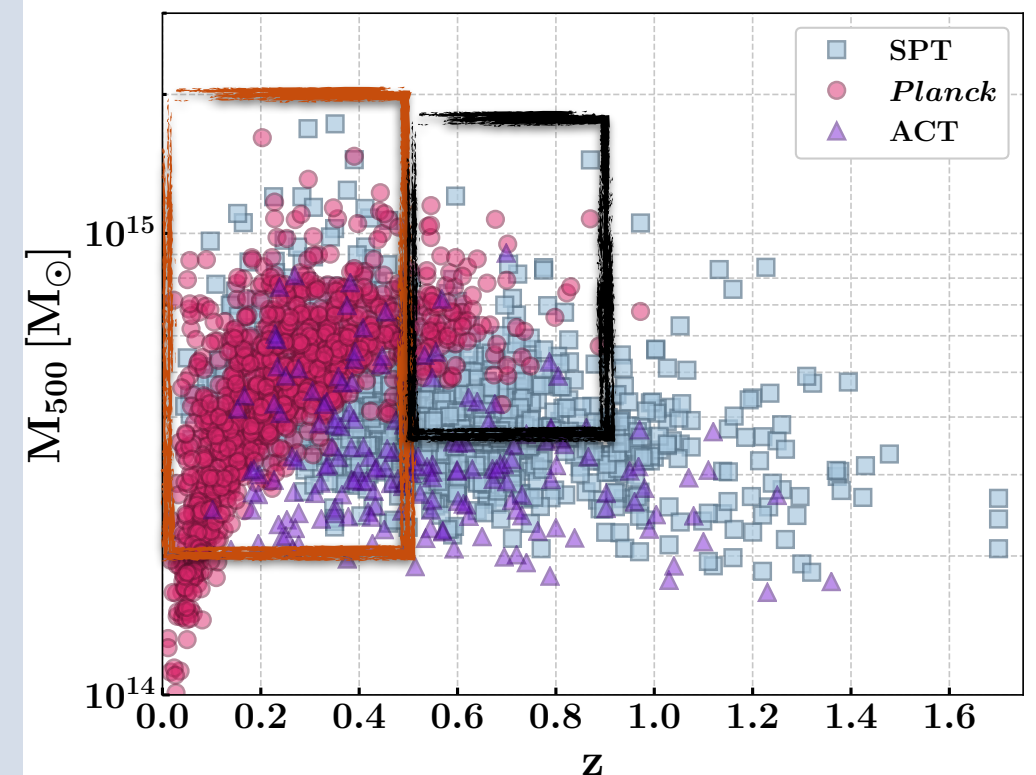
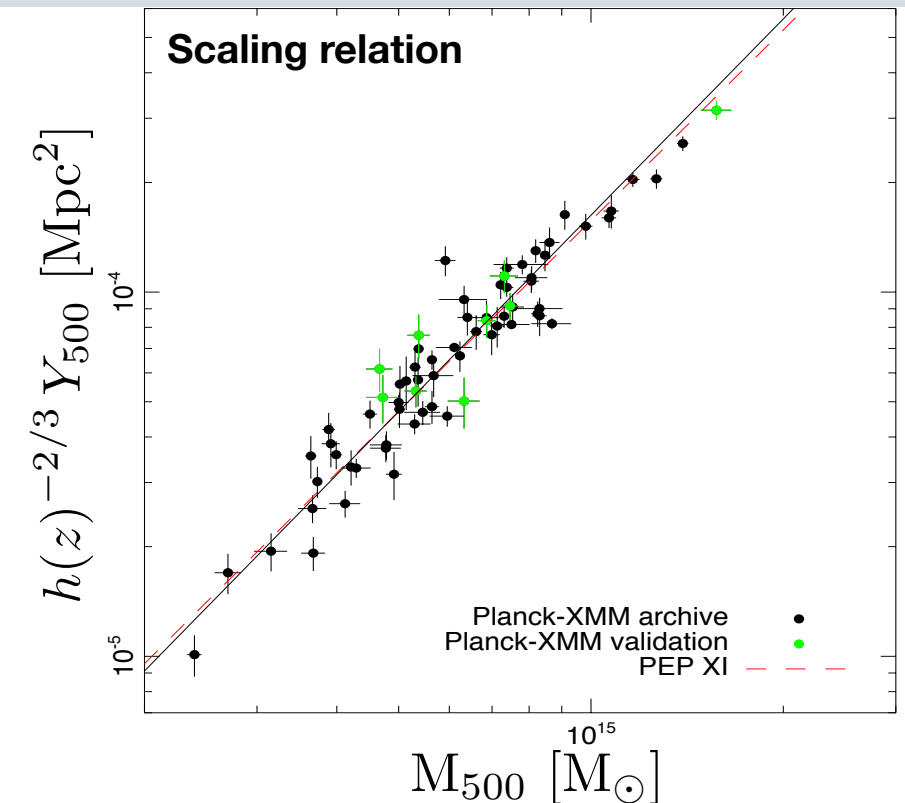
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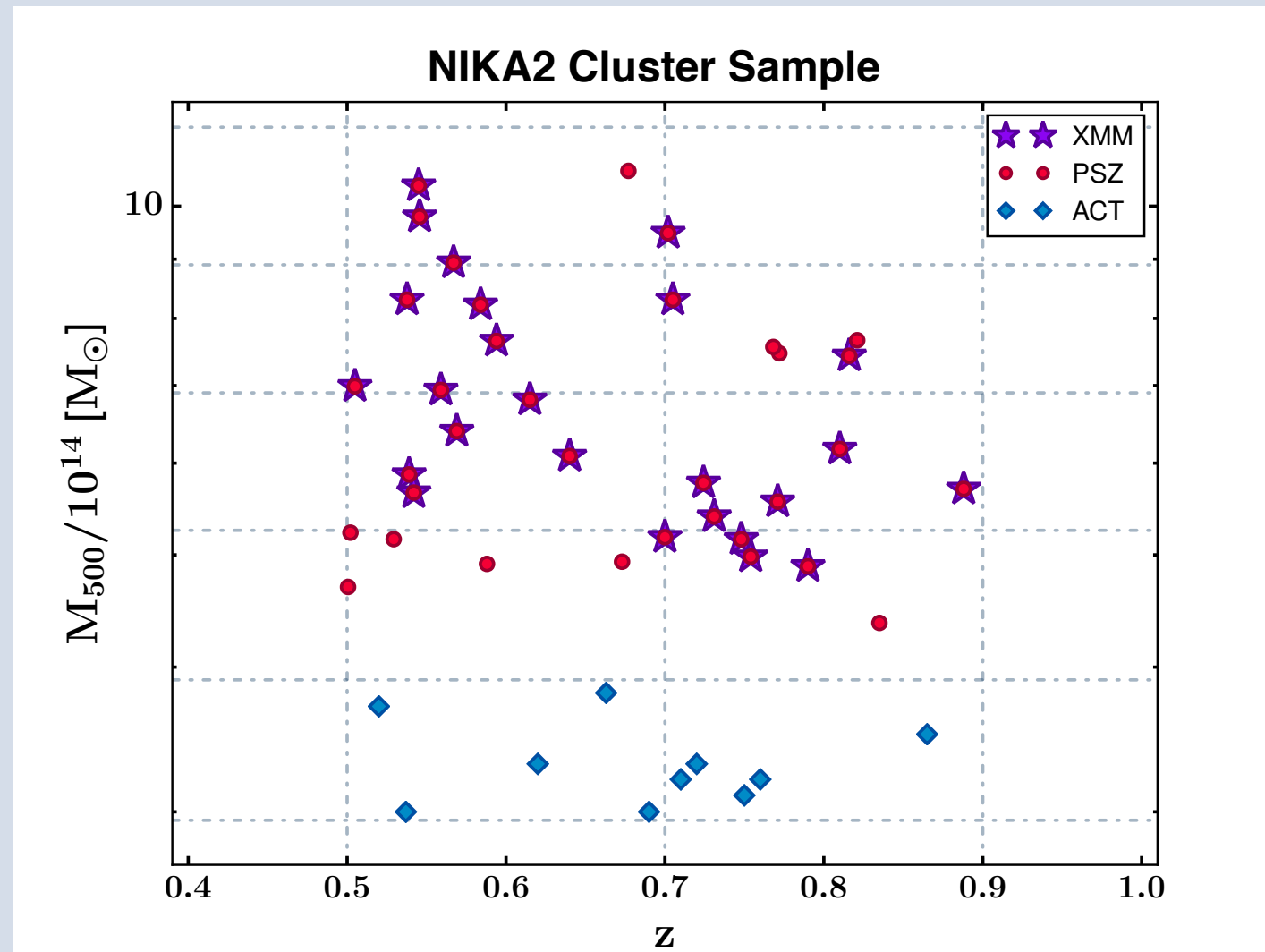
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# The NIKA2 SZ Large Program

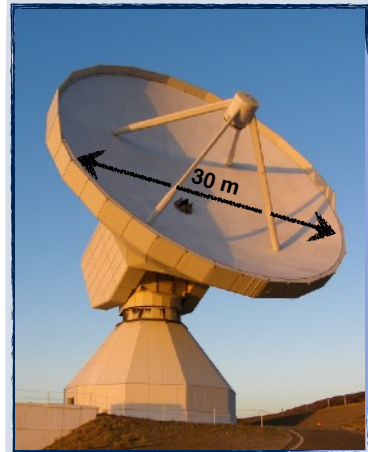


- **High-angular resolution SZ observations of 50 galaxy clusters at high redshift:  $z \in [0.5, 0.9]$** 
  - 300 hours of guaranteed time at the IRAM 30-m telescope
  - Representative sample of clusters extracted from the *Planck* and ACT catalogs
  - X-ray / SZ combination with XMM-Newton and NIKA2 ➡ SZ observable + mass

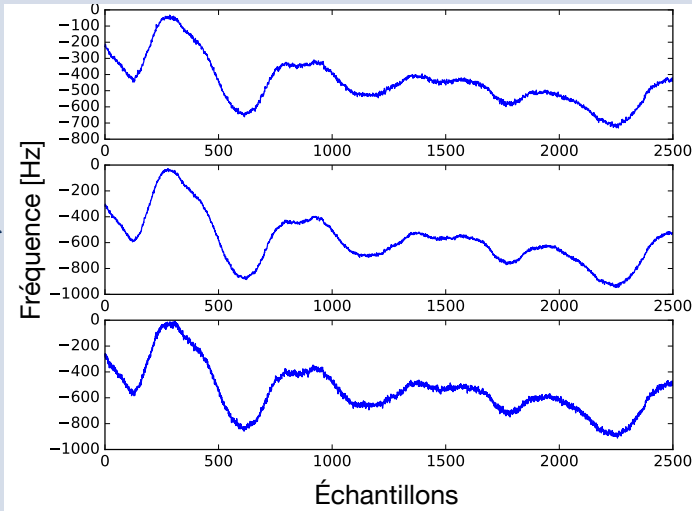


# The NIKA2 SZ Large Program in one diagram

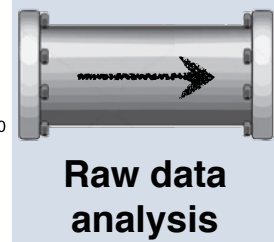
Observations



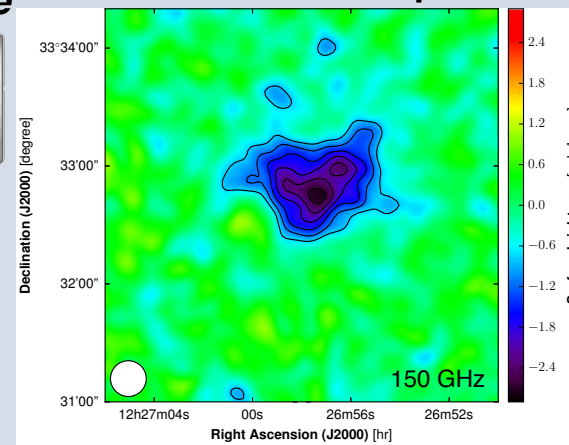
NIKA2 Raw Data



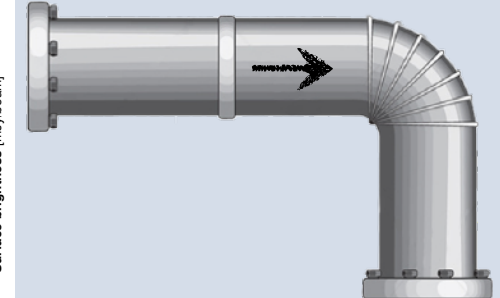
NIKA2 Pipeline



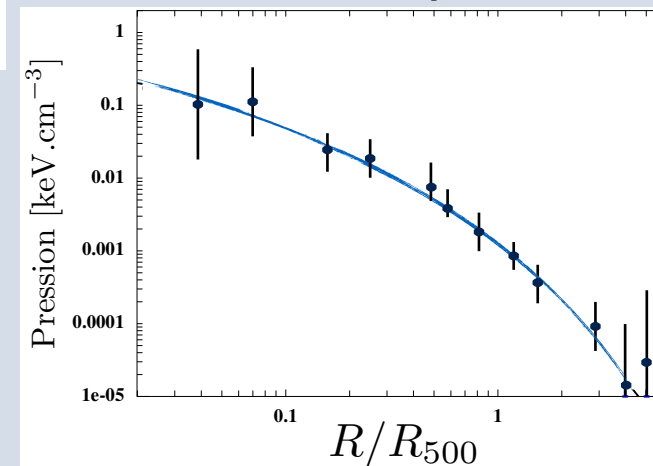
NIKA2 SZ map



SZ pipeline: deprojection

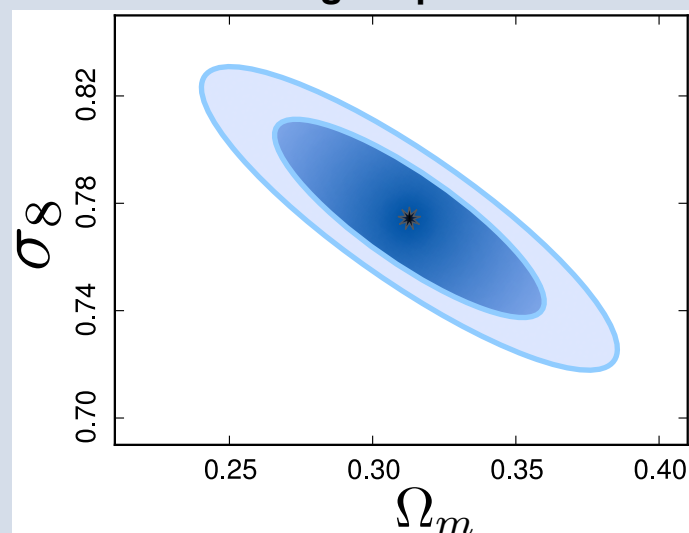


Pressure profile



*From cluster observations to cosmological parameters*

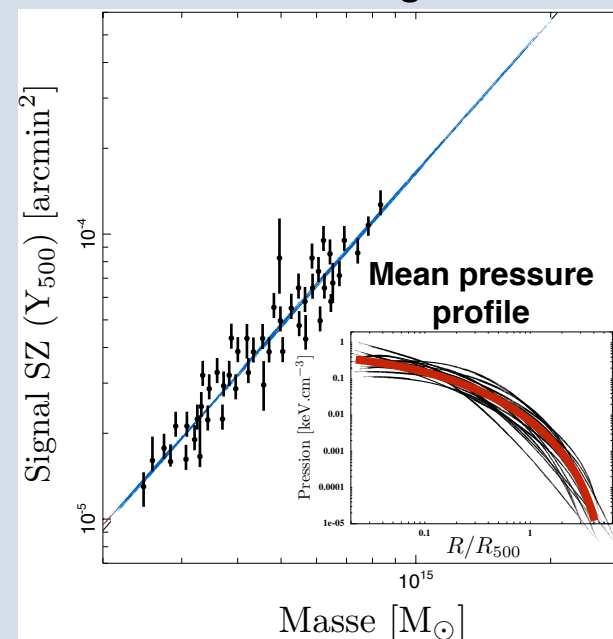
Cosmological parameters



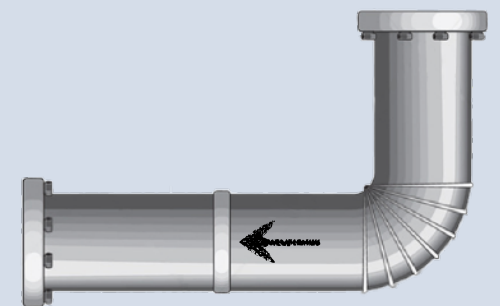
Cosmology pipeline



NIKA2 scaling relation



$$Y_{500} = 5.61^{+0.68}_{-0.59} \times 10^{-4} \text{ arcmin}^2$$



NIKA2 SZ Large Program

Analysis of systematic effects at each step of the program

# Estimation of the pressure profile

## Estimation of the pressure profile

- **Standard method:** parametric model  
*Adapted to relaxed clusters*
- **New method:** non-parametric deprojection  
**Markov Chain Monte Carlo analysis (MCMC)**  
*N constrained points + power law interpolation*

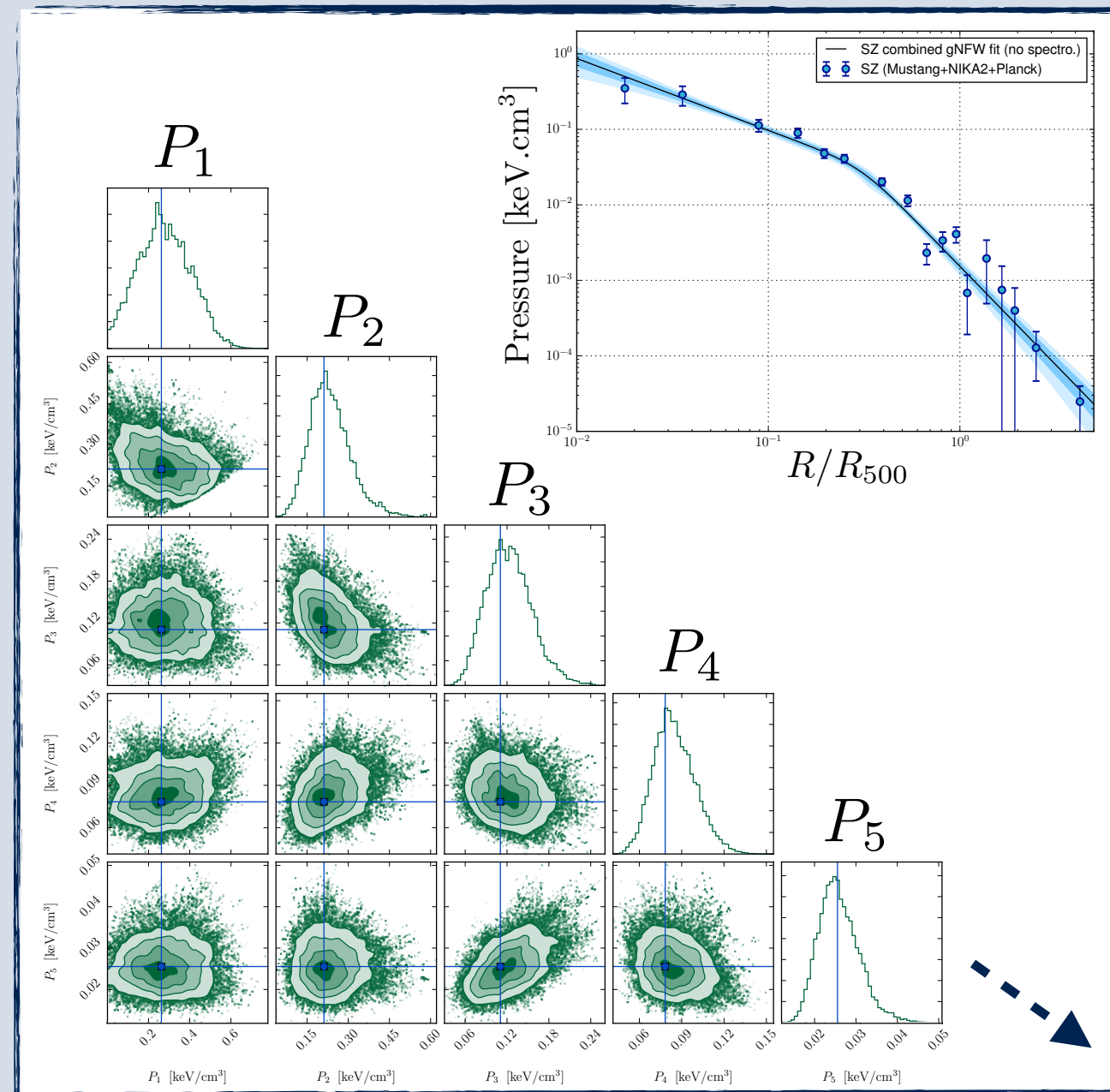
Decrease of computation time (*analytical integration*)

Shock identification (*pressure profile discontinuities*)

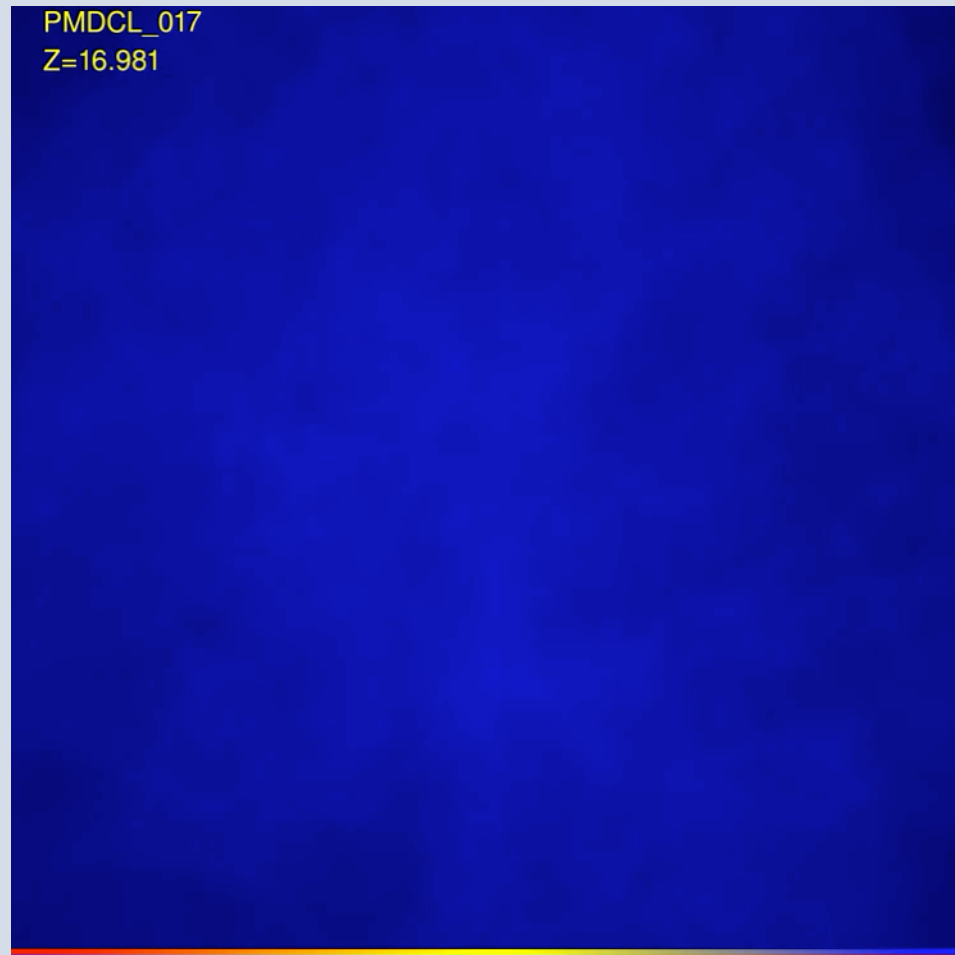
Multi-probe analysis code: **official NIKA2 SZ pipeline**

F. Ruppin *et al.*, Astron. Astrophys. 597, A110 (2017)

F. Ruppin *et al.*, Astron. Astrophys. 615, A112 (2018)



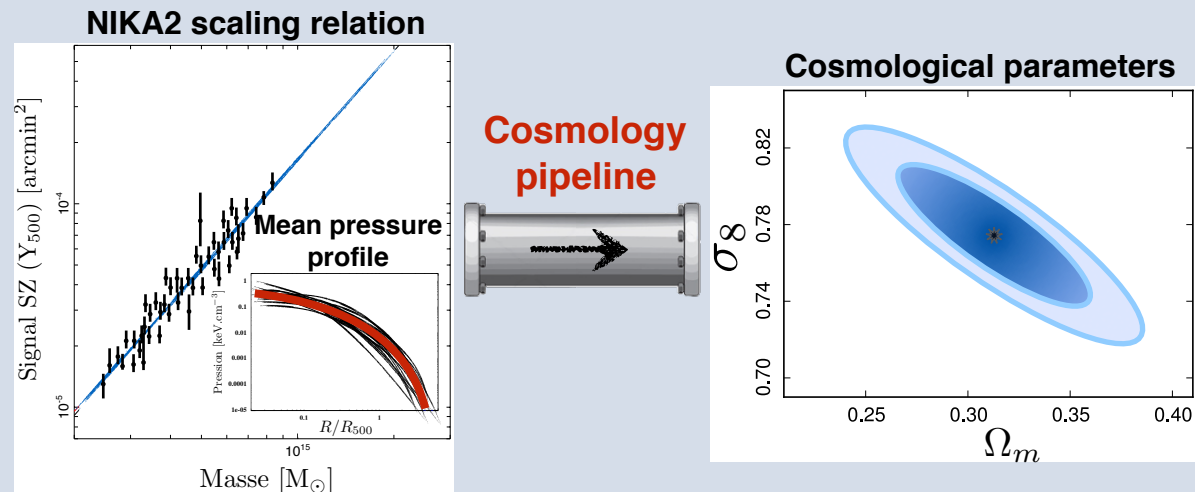
# Hydrodynamic simulation: prospective studies



- Work with MUSIC **hydrodynamic simulation**
- Collaborators in Rome and Madrid
- Study of a twin sample of the NIKA2 SZ Large Program:  
**Mean pressure profile** and intrinsic scatter
- ▶ Impact of ICM dynamics on the mean pressure profile

**F. Ruppin** *et al.*, Astron. Astrophys. 631, A21 (2019a)

# From the mean pressure profile to cosmology



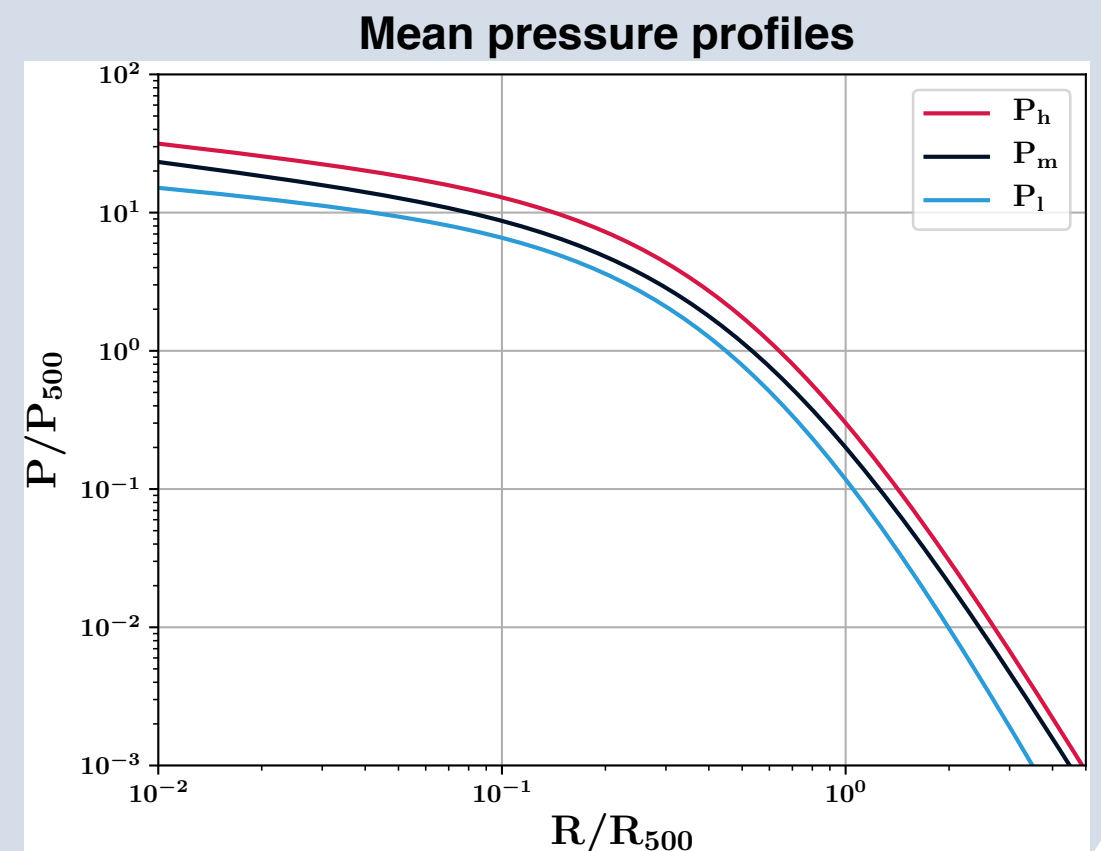
## Cluster Cosmology: *Planck* SZ power spectrum

► Impact of a modification of the mean pressure profile on  $\sigma_8$  and  $\Omega_m$

- **SZ power spectrum:** depends on cosmological parameters and the mean pressure profile
- Cosmological analysis: MCMC for each profile
- Comparison with *Planck* CMB results

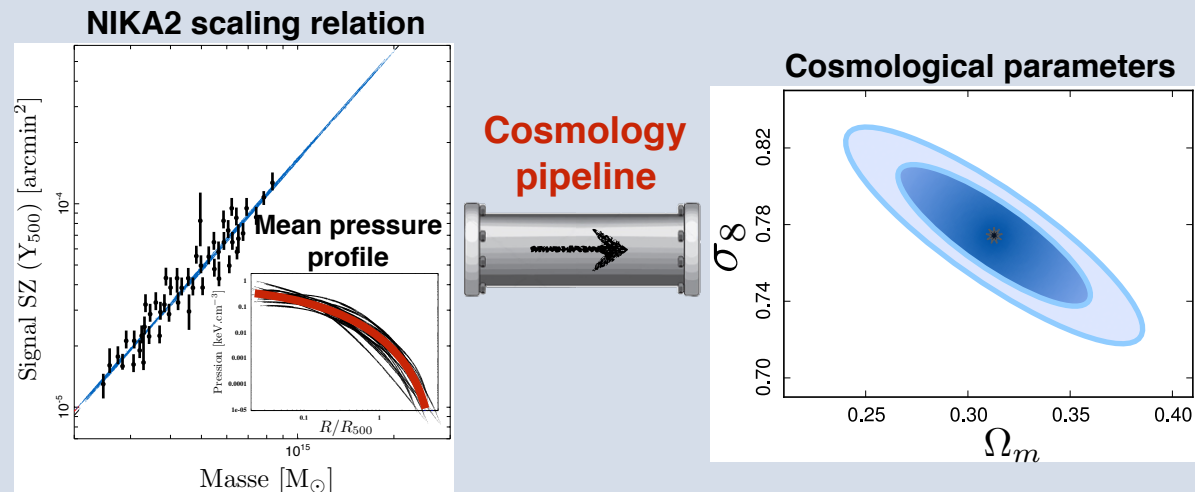
- Significant impact on the estimation of **cosmological parameters**
- Cancel the **tension** between the CMB and cluster constraints

F. Ruppin *et al.*, MNRAS 490, 784 (2019b)





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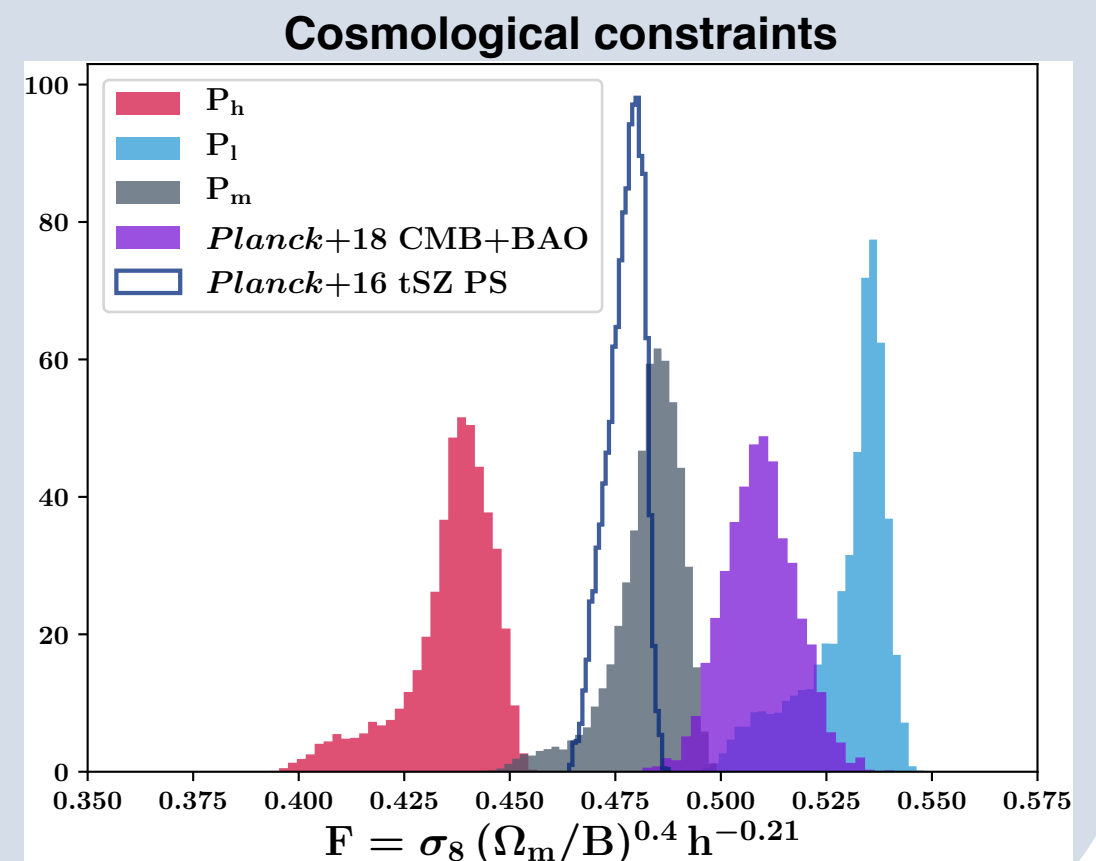
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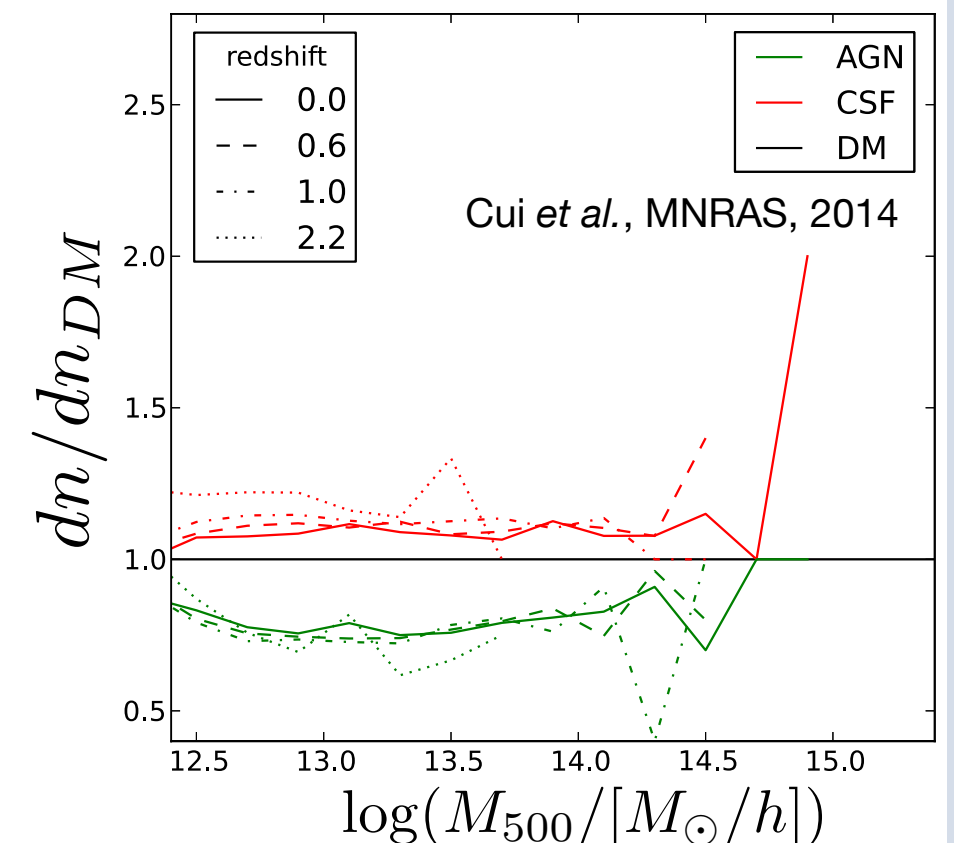
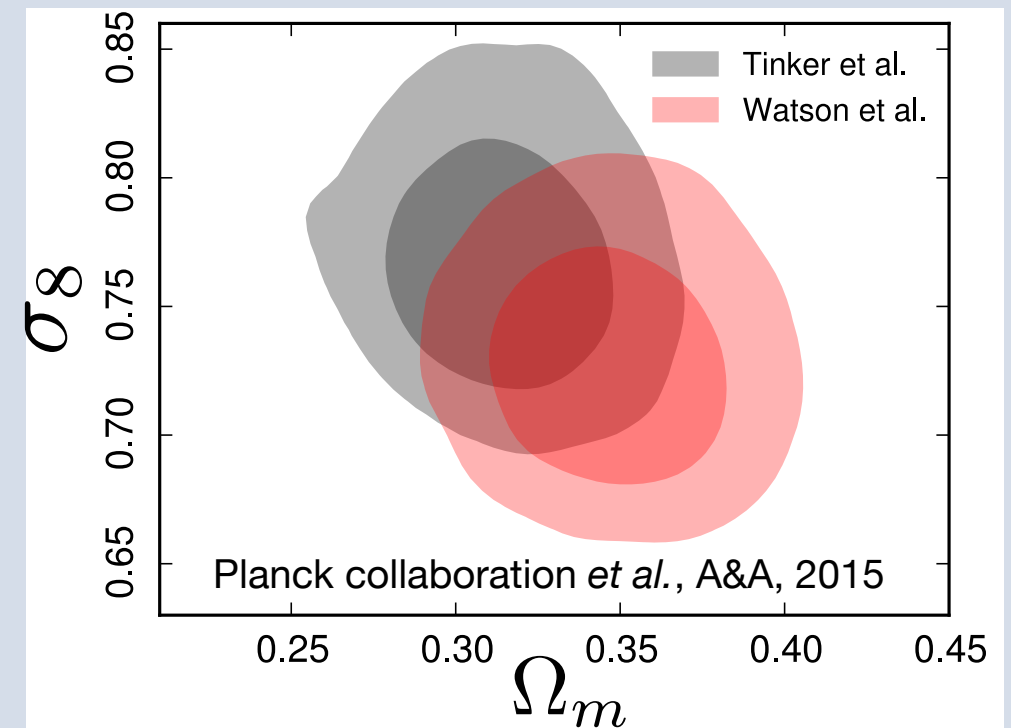
# Systematics on the cluster mass function

Systematic effects on the mass function:

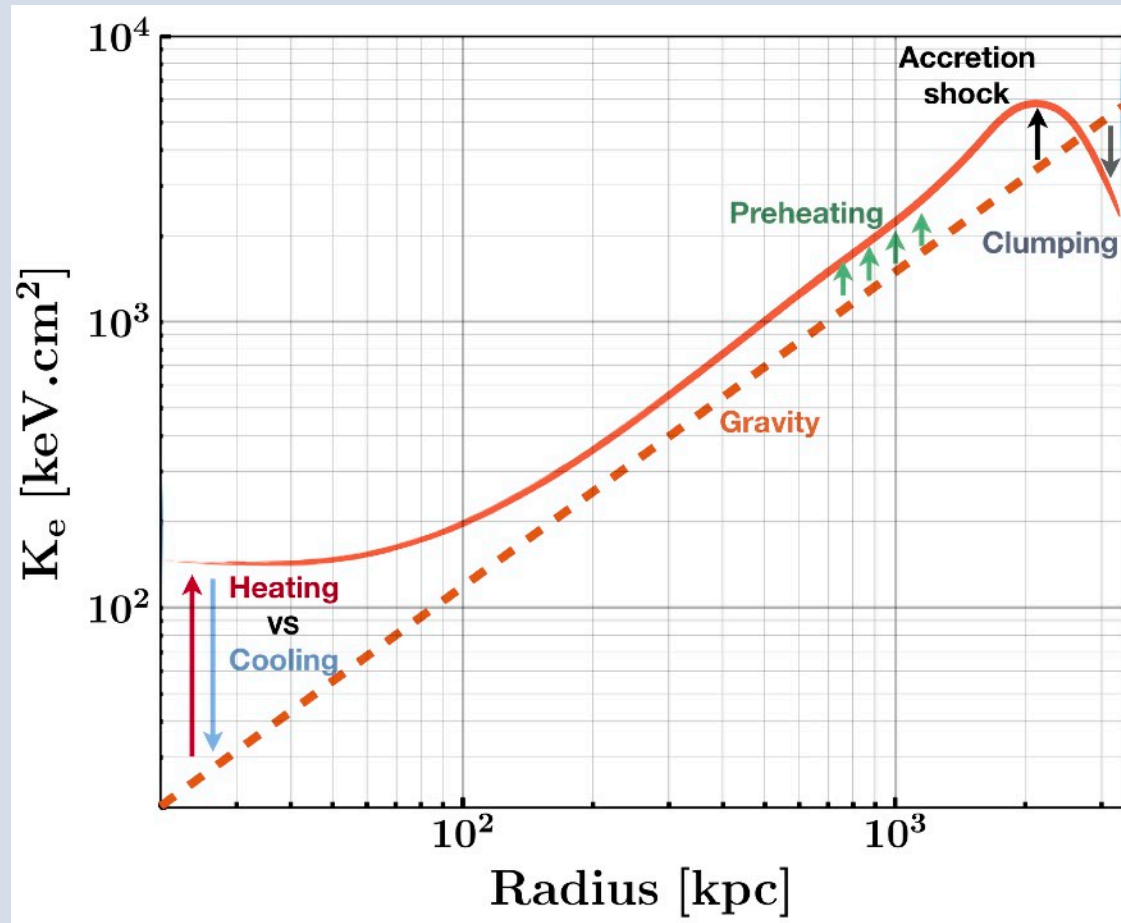
$$\frac{dn}{dM_{500}}$$

- Calibrated from numerical simulations (*mostly N-body*)
- Significant cosmological impact
- Hydrodynamic simulations: different cluster abundance  
*Impact of gas properties and feedback on cluster abundance*
- Not enough knowledge on:
  - AGN feedback
  - heat dissipation within the ICM

→ Observational priors to improve cosmological simulations



# Observational priors for simulations



- Radial distribution of gas entropy

$$K_e(r) = \overset{\text{SZ effect}}{P_e(r)} / \overset{\text{X-rays}}{n_e(r)}^{5/3}$$

- Shape and amplitude: energy inputs in the ICM

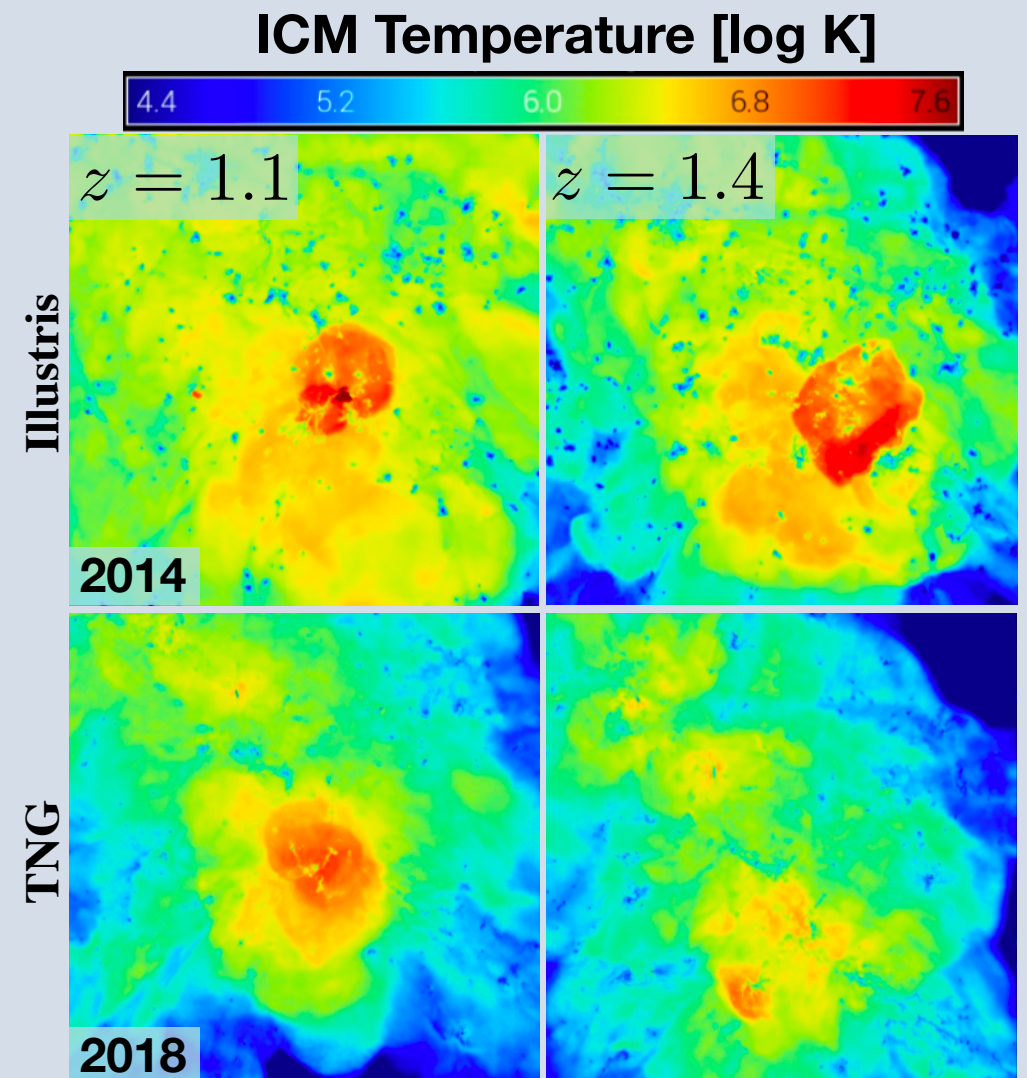
- ICM temperature map:

$$k_B T_e(x, y) = \overset{\text{SZ effect}}{P_e(x, y)} / \overset{\text{X-rays}}{n_e(x, y)}$$

- Merging substructure thermalization with the main halo

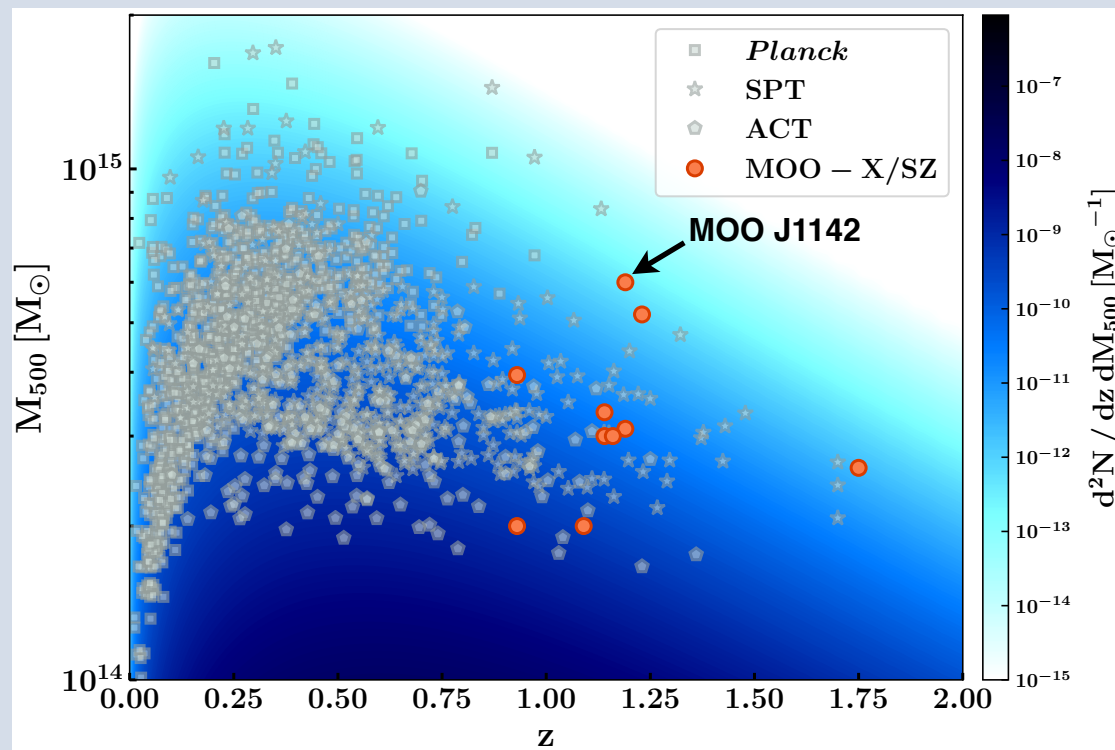
Need high-angular resolution X-ray/SZ observations at  $z > 1$

➡ Improvement of the simulations





# Properties of massive clusters at $z > 1$

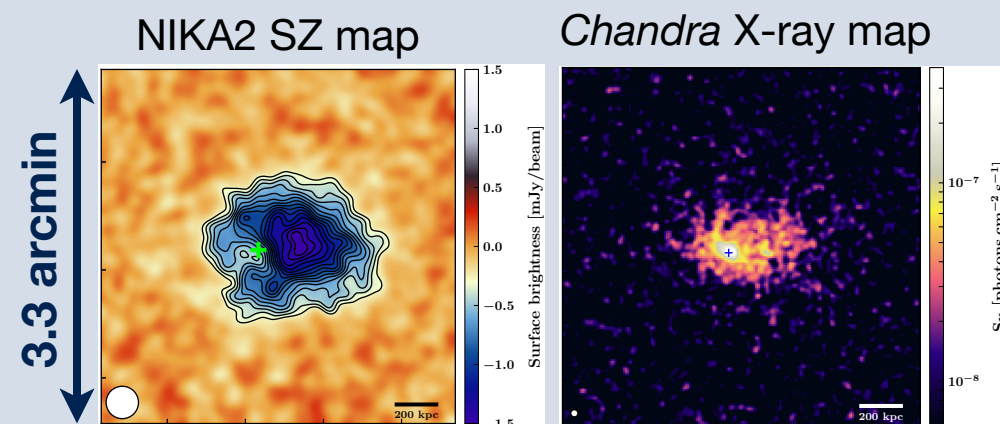


## Large program of X-ray and SZ observations at $z > 0.9$ :

- Clusters discovered in Optical/IR: MaDCoWS and IDCS surveys
- Sample of 10 clusters at  $0.93 < z < 1.75$

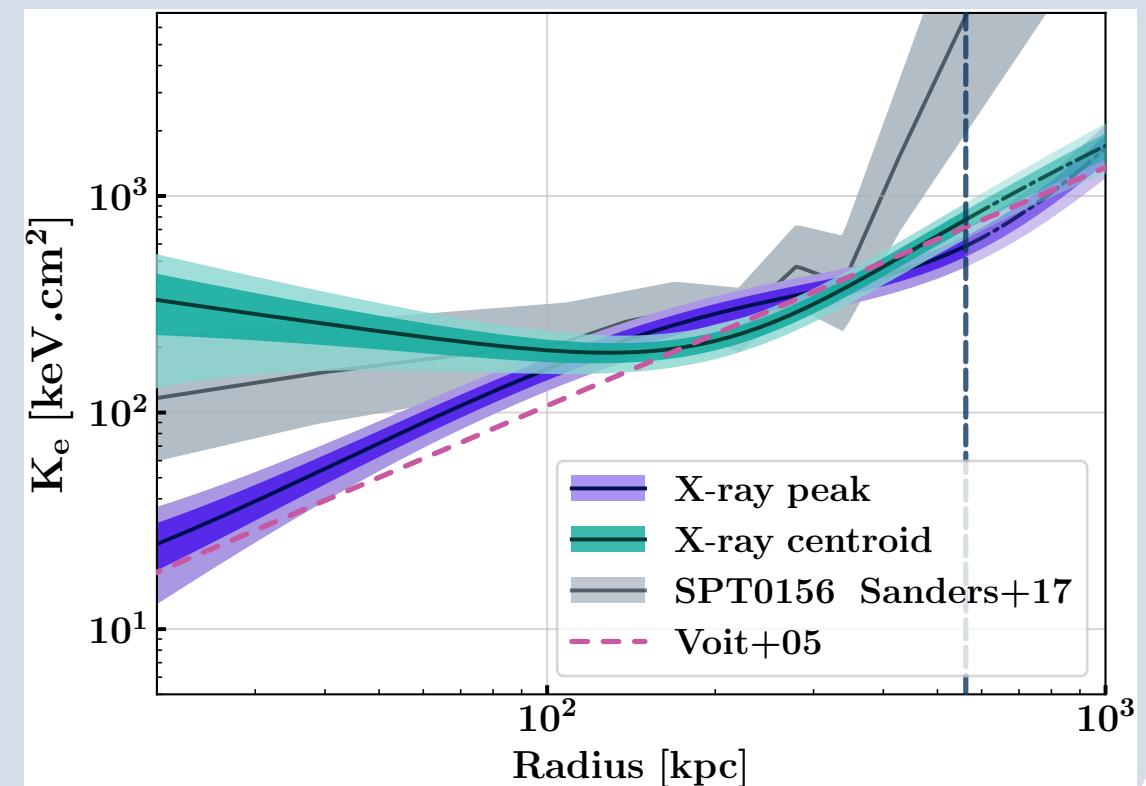
## The case of MOO J1142: merging cluster at $z = 1.2$

- **X-ray/SZ pipeline:** entropy profile + temperature map



## X-ray/SZ analysis

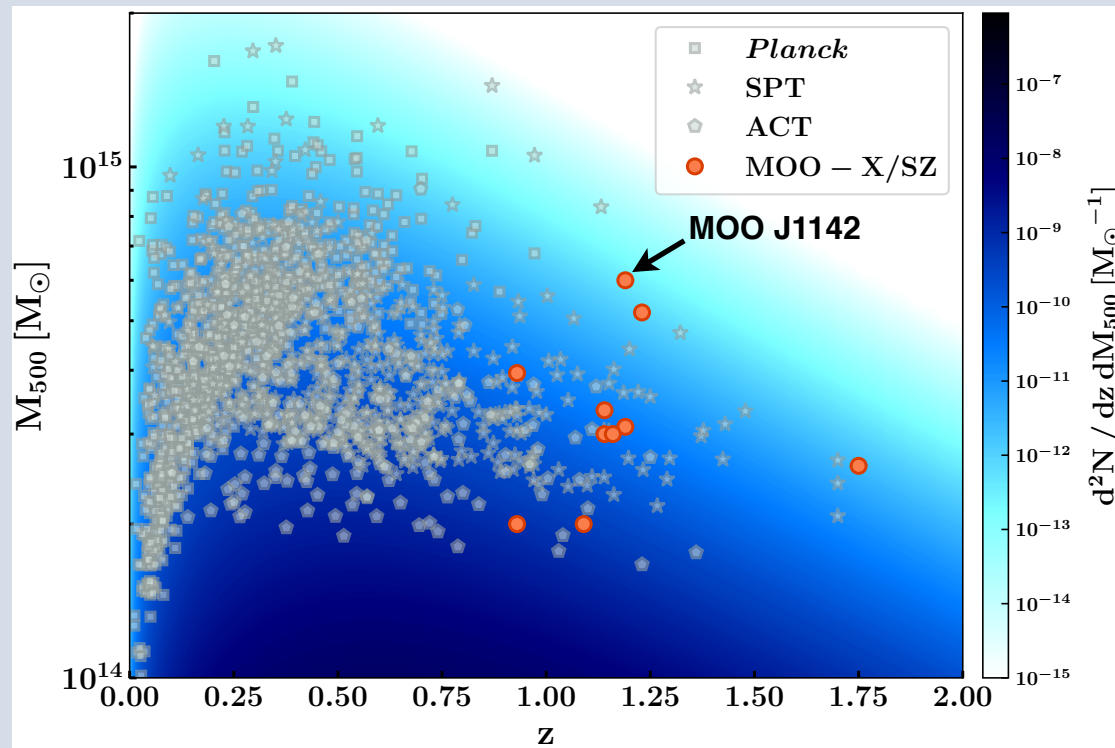
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- Entropy: profile 3 times more constrained than X-ray results
- Temperature: map of a merging cluster

F. Ruppin *et al.*, ApJ 893, 74 (2020a)

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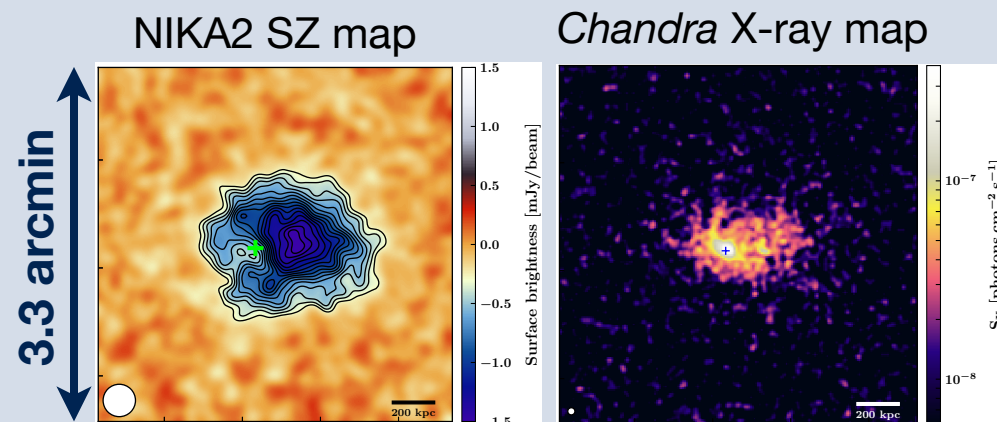


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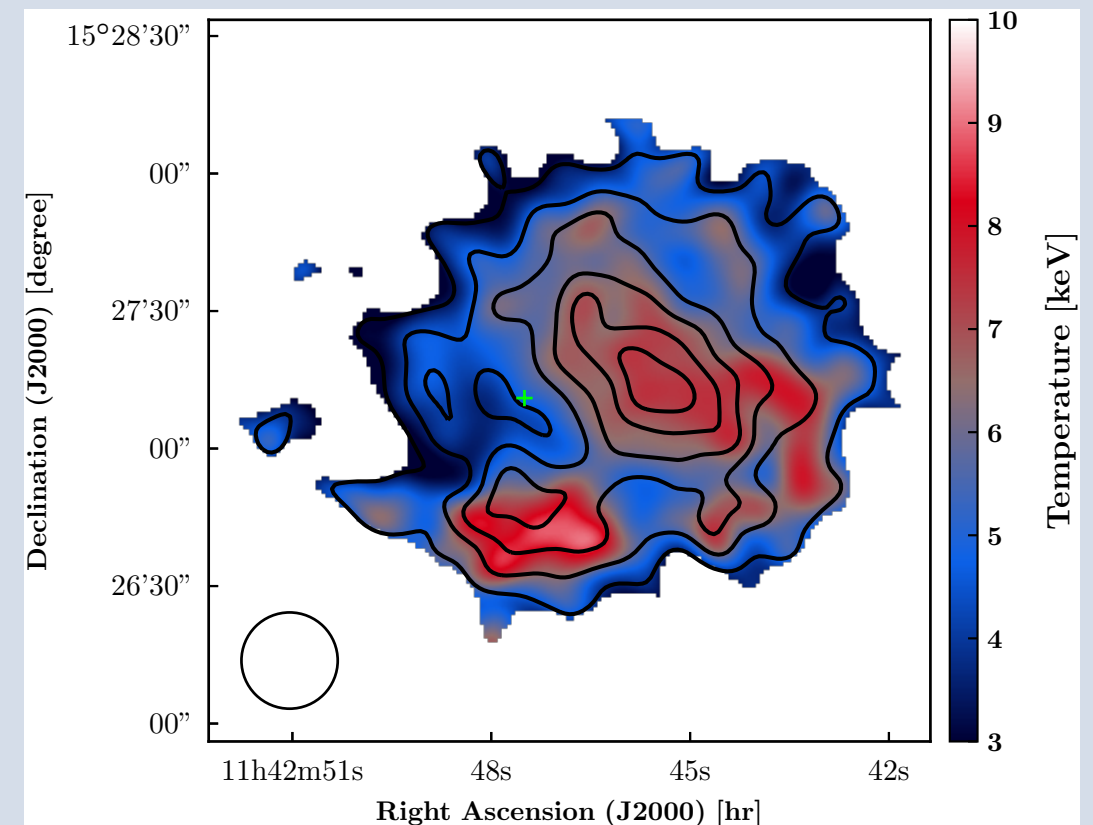
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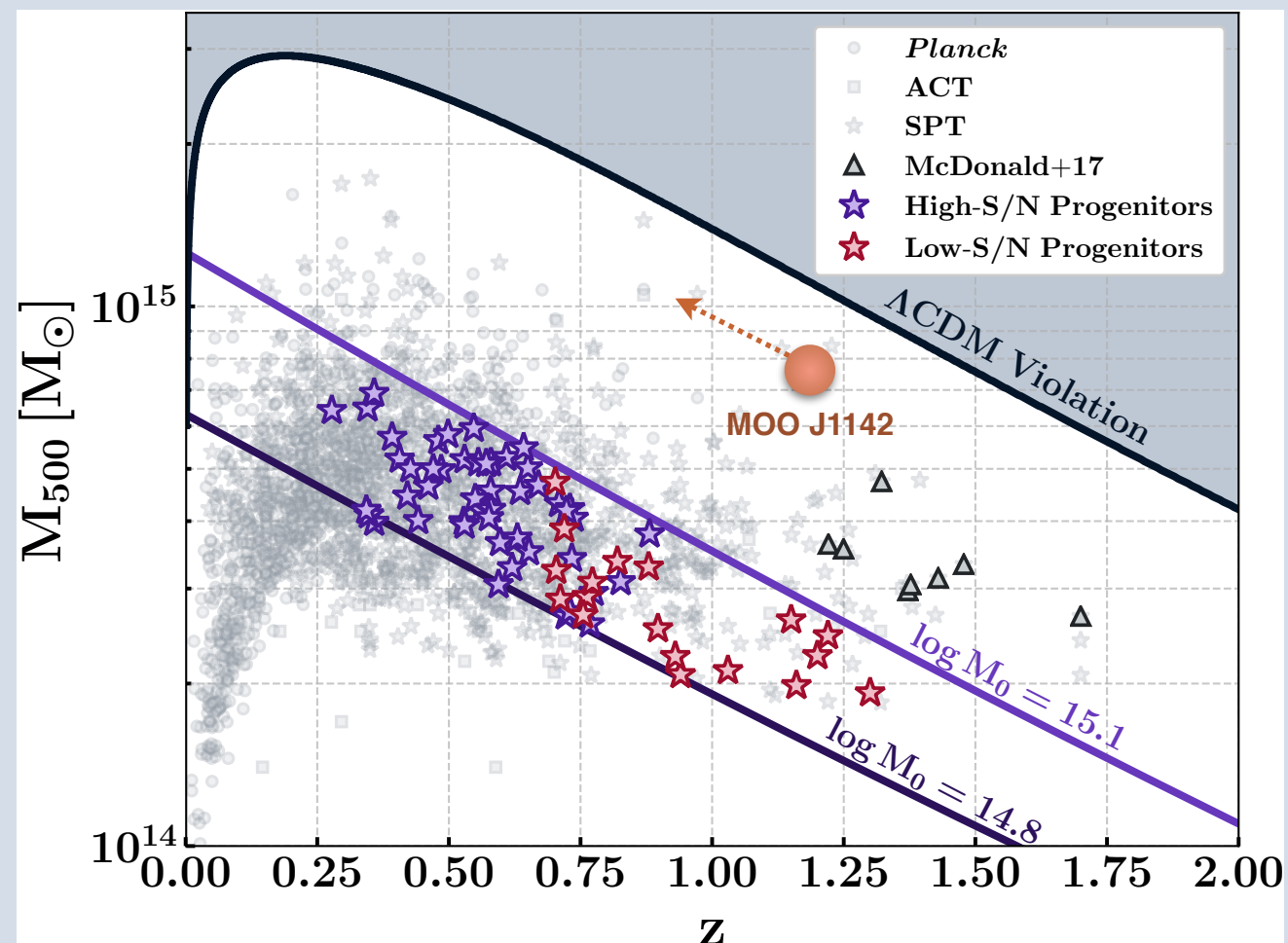
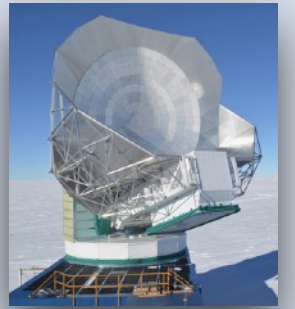


F. Ruppin *et al.*, ApJ 893, 74 (2020a)

# ICM evolution along a common evolutionary track

## Large program of *Chandra* X-ray observations:

- Sample of 67 clusters: progenitors of the most well-know clusters at  $z = 0$
- SPT: South Pole Telescope for CMB observations
- New pipeline for the collaboration: SPT/*Chandra* combination → divide by 10 the requested *Chandra* exposures



Cool-core fraction: stable for 9 Gyr of cluster growth  
Incompatible with results from recent simulations

F. Ruppin *et al.*, under reviewing (2020b)



# Conclusions

Inflation

Neutrinos

Dark Energy

- **Galaxy Clusters:** cosmological probe complementary to BAO, SNe, CMB →
  - Robust constraints (*systematics*)
  - Precise constraints (*degeneracies*)
  - Tensions (*new physics*)
- **Systematics on cluster abundance:**
  - measurement of the observable
  - mass calibration (*scaling relation*)
  - halo mass function (*simulations*)
  - selection function (*instrument + analysis*)
- **NIKA2 SZ Large Program:** new insights on redshift evolution of SZ-mass scaling relation → impact on cosmology
- **Joint X-ray/SZ analyses:** push the investigation of ICM evolution to low mass and high redshift → simulations

High-angular resolution multi-wavelength follow-ups of clusters are essential to next generation cluster surveys



# Thank you



*Credit: Geoffrey Chen*

<http://www.mit.edu/~ruppin/>