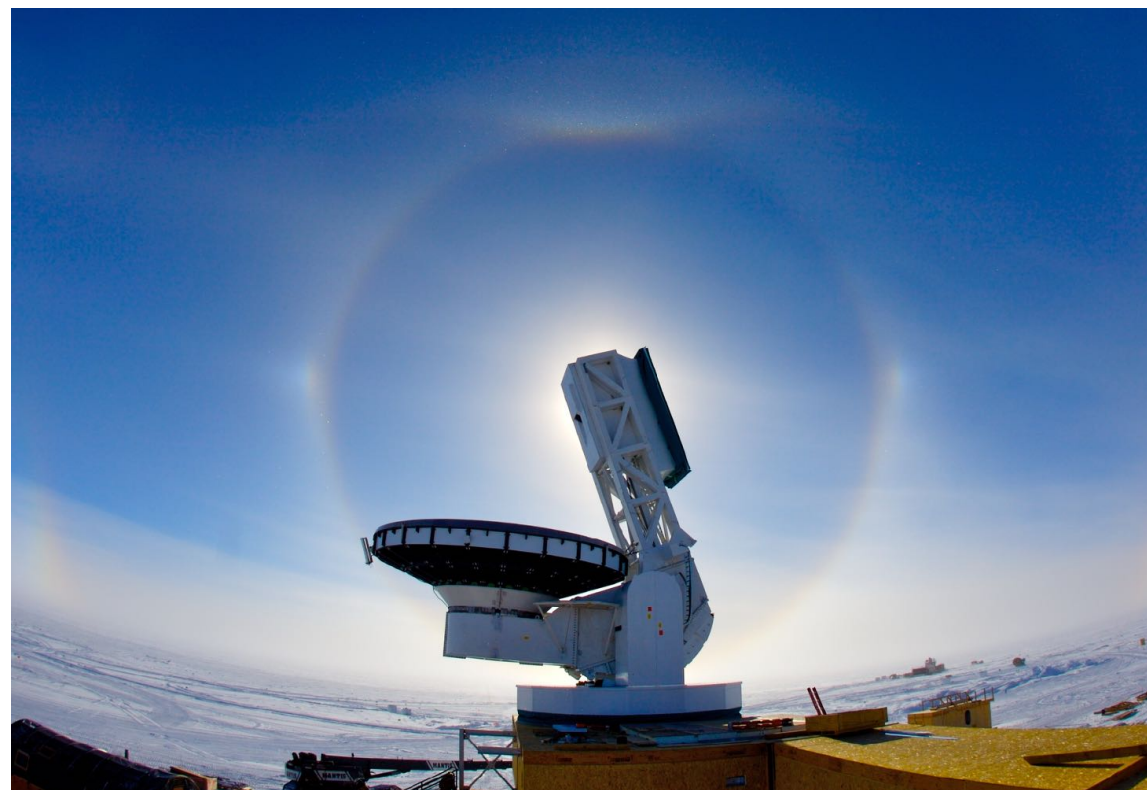


# Galaxy Cluster Cosmology with the South Pole Telescope



Sebastian Bocquet - LMU Munich  
and the SPT collaboration

Bocquet et al., 2018, ApJ submitted, arXiv:1812.01679

Stern, Dietrich, Bocquet et al., 2019, MNRAS accepted, arXiv:1802.04533

Dietrich, Bocquet, Schrabback et al., 2019, MNRAS 483, 2871, arXiv:1711.05344

Schrabback, Applegate, Dietrich, Hoekstra, Bocquet et al., 2018, MNRAS, 474, 2635, arXiv:1611.03866

de Haan et al., 2016, 2016, ApJ, 832, 95, arXiv:1603.06522

Bleem et al., 2015, ApJS, 216, 27, arXiv:1409.0850

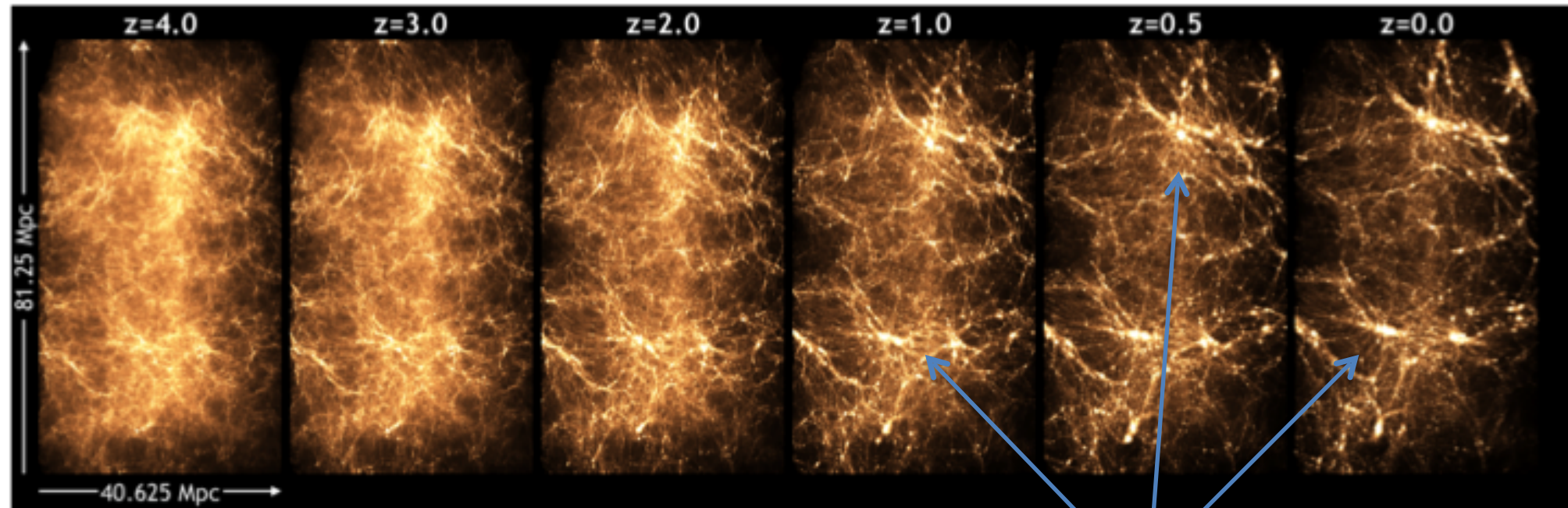
1. Cluster Cosmology in a Nutshell
2. Clusters in the South Pole Telescope Survey
3. Our Latest Cosmology Study
4. Outlook

- **We will not**
  - assume hydrostatic equilibrium
  - consider a hydrostatic bias extracted from hydro simulations (let's discuss their predictivity/validation over coffee/beer!)
- **We will** trust our intuition (and vast literature proving) that
  - cluster mass proxies correlate with mass
  - weak gravitational lensing measures halo mass on average with %-level systematic uncertainty

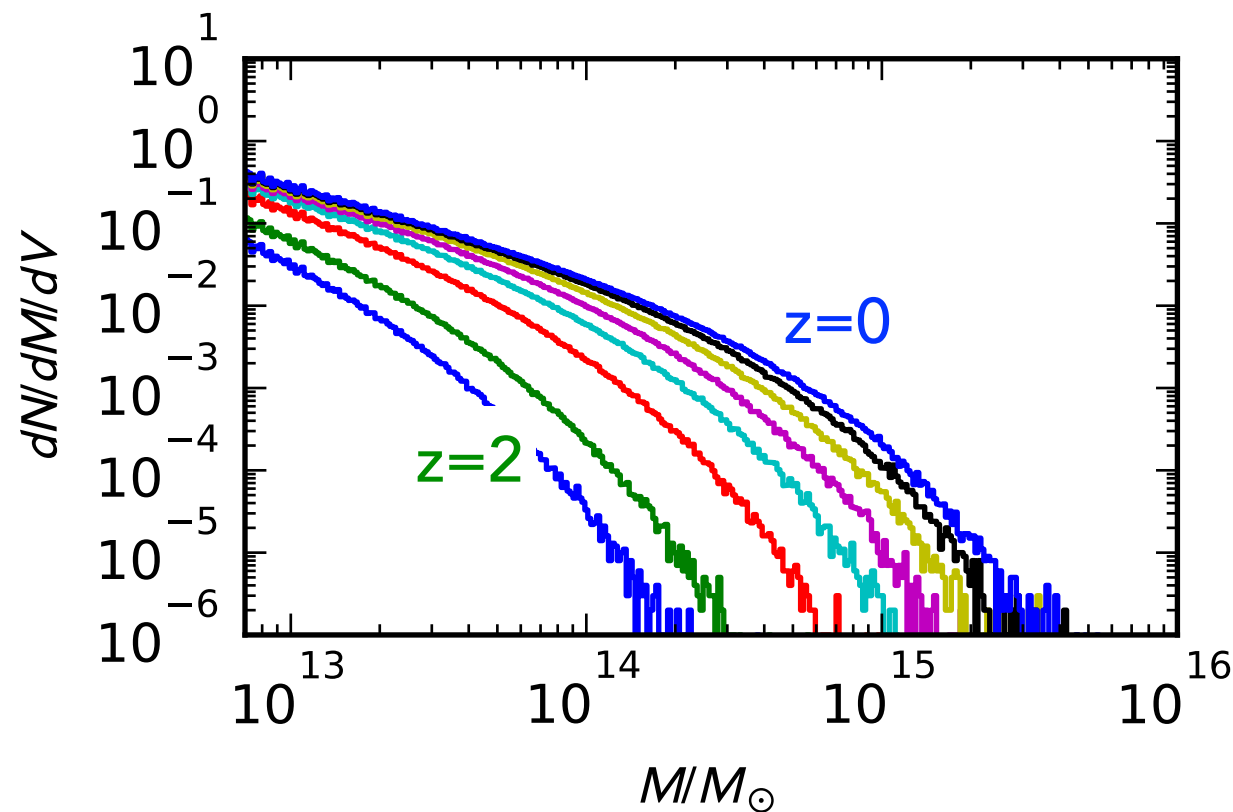
# Cluster Cosmology in a Nutshell



The Q Continuum Simulation: Heitmann+15 (arXiv:1411.3396)



dark matter halo



1. Predict abundance of halos as a function of cosmology using numerical simulations
2. Measure number of galaxy clusters in a given survey as a function of mass and redshift
3. Learn about cosmology



# Back to reality...



Credit: NASA/CXC/Cinestav/T.Bernal et al.

## In practice: Empirical calibration of mass-observable relations

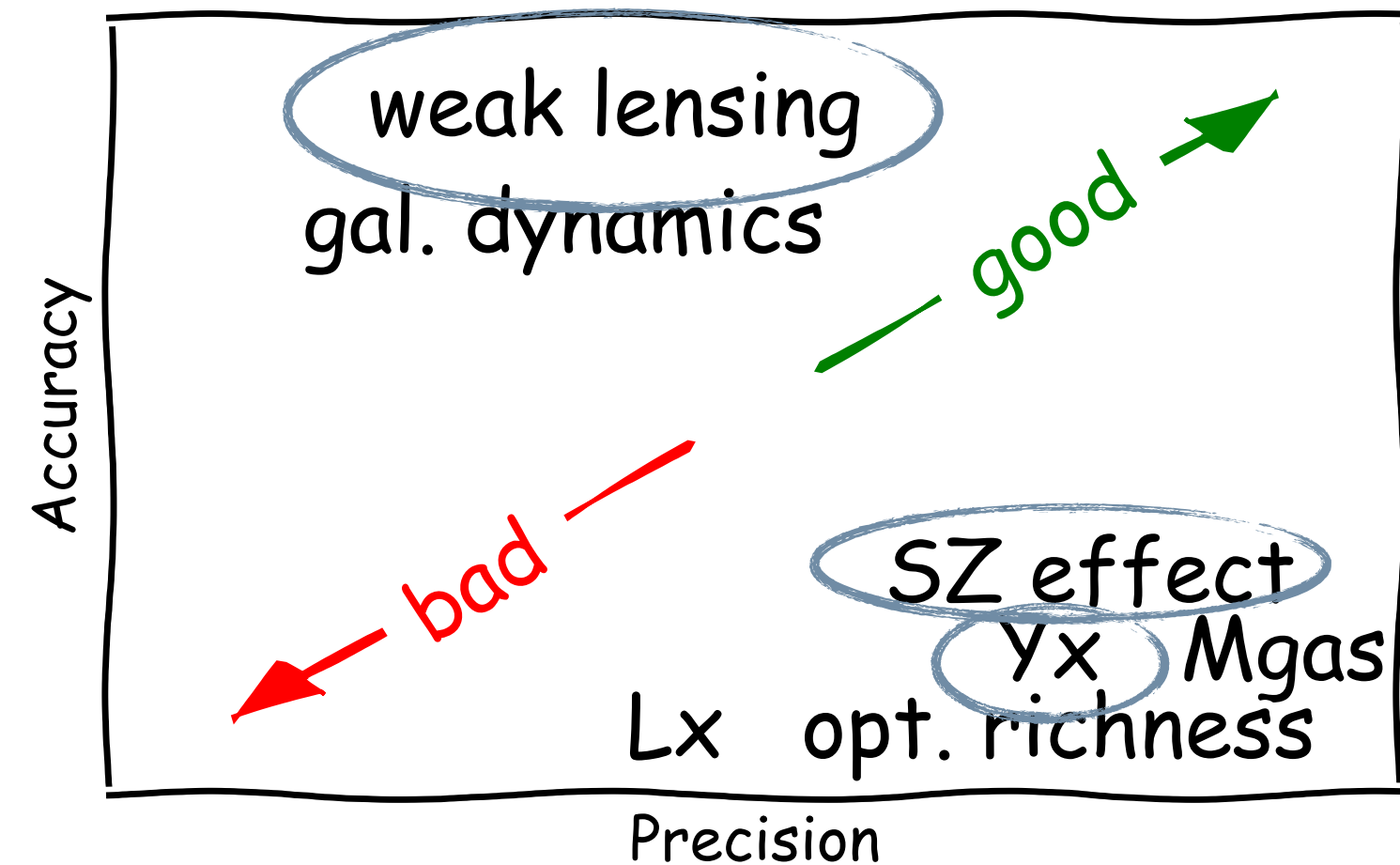


Credit: NASA, ESA, and J. Lotz, M. Mountain, A. Koekemoer, and the HFF Team (STScI)  
<http://www.spacetelescope.org/images/heic1401a/>



Credit: NASA, ESA, the Hubble Heritage Team (STScI/AURA), J. Blakeslee (NRC Herzberg Astrophysics Program, Dominion Astrophysical Observatory), and H. Ford (JHU) <http://www.spacetelescope.org/images/heic1317a>

# Mass Proxies



- SZ effect and X-ray  $Y_x$ 
  - Small intrinsic & measurement scatter  $< 20\%$
  - Systematically limited by our (lack of) understanding of gas physics in clusters
- Weak gravitational lensing
  - Measures total mass
  - Mass modelling in  $N$ -body simulations
  - %-level systematics
  - Large intrinsic & measurement scatter  $> \sim 30\%$

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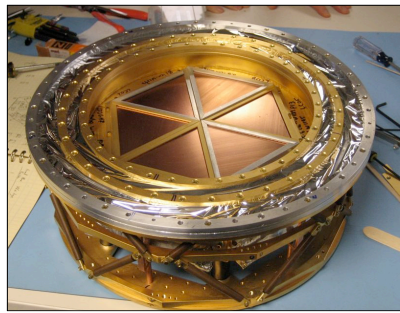
# The South Pole Telescope (SPT)

10-meter sub-mm quality  
wavelength telescope

95, 150, 220 GHz and  
1.6, 1.2, 1.0 arcmin resolution

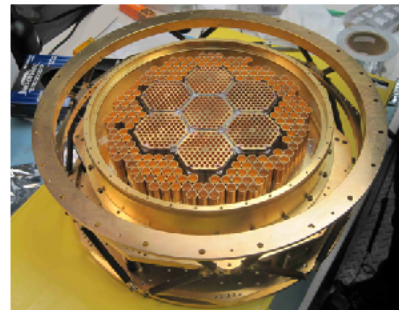
## 2007: SPT-SZ

960 detectors  
95, 150, 220 GHz



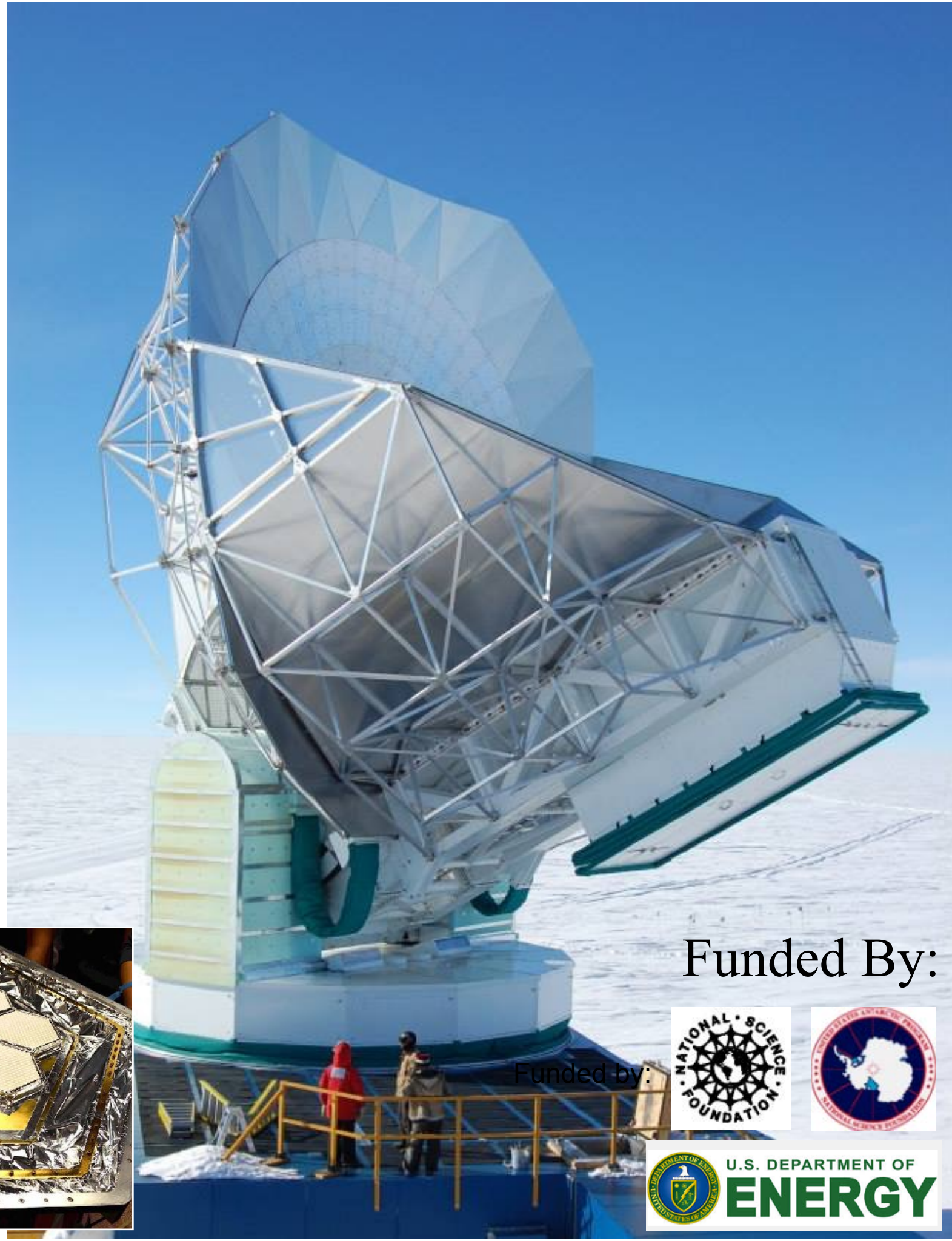
## 2012: SPTpol

1600 detectors  
90, 150 GHz  
**+Polarization**



## 2016: SPT-3G

~16,200 detectors  
95, 150, 225 GHz  
**+Polarization**



Funded By:



U.S. DEPARTMENT OF  
**ENERGY**

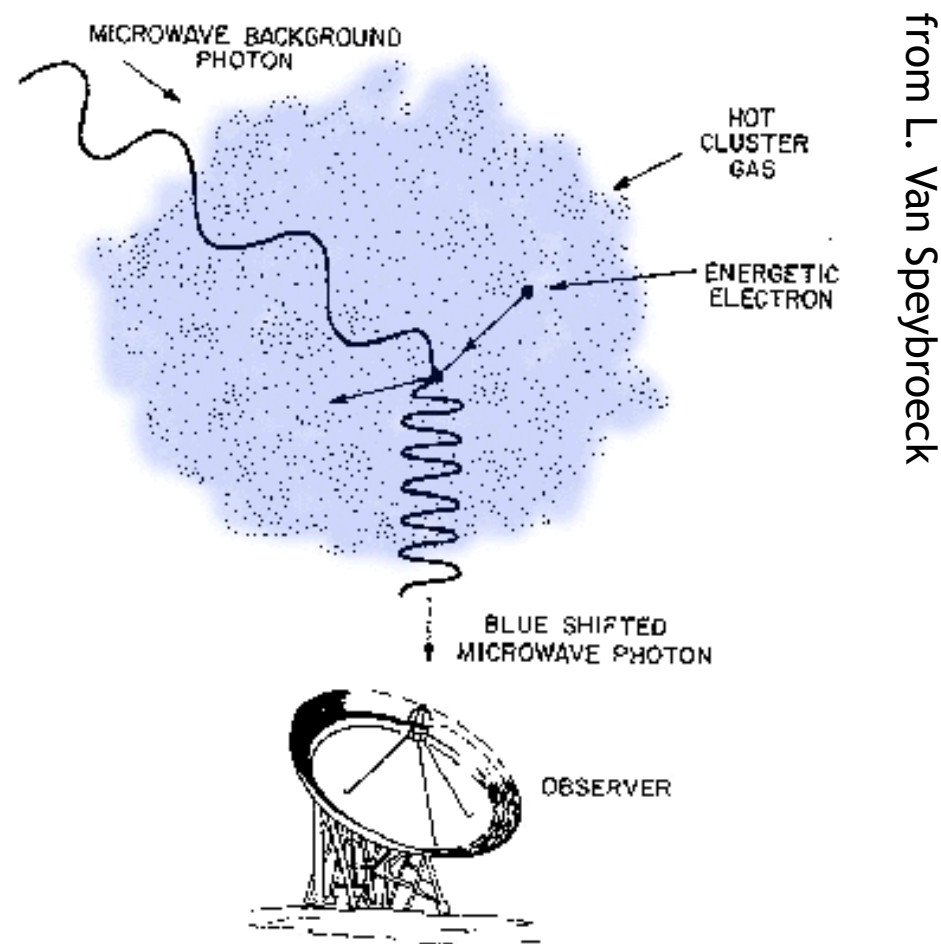




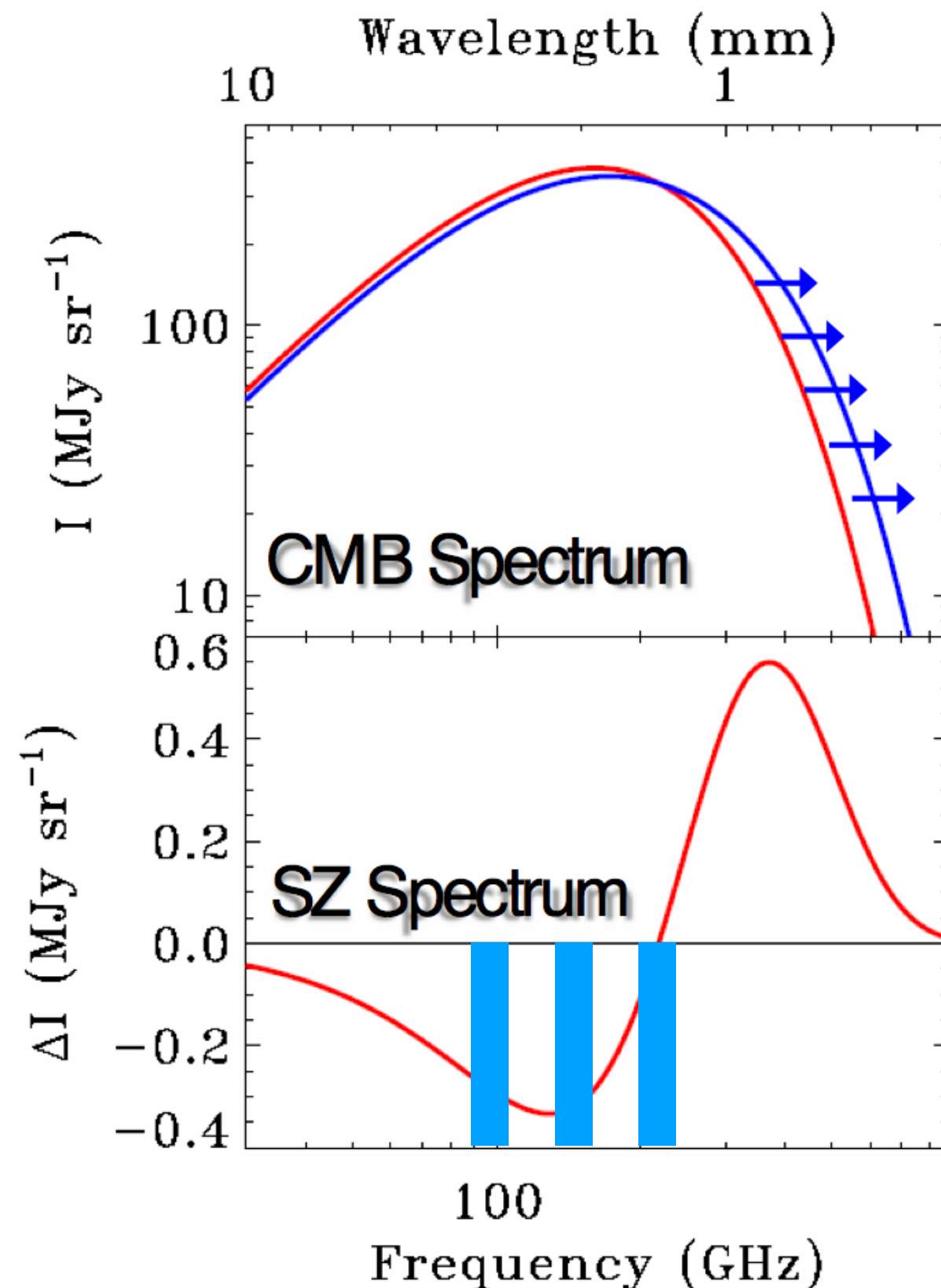
**Image credit: SPT 2018 winter-overs Adam & Joshua**

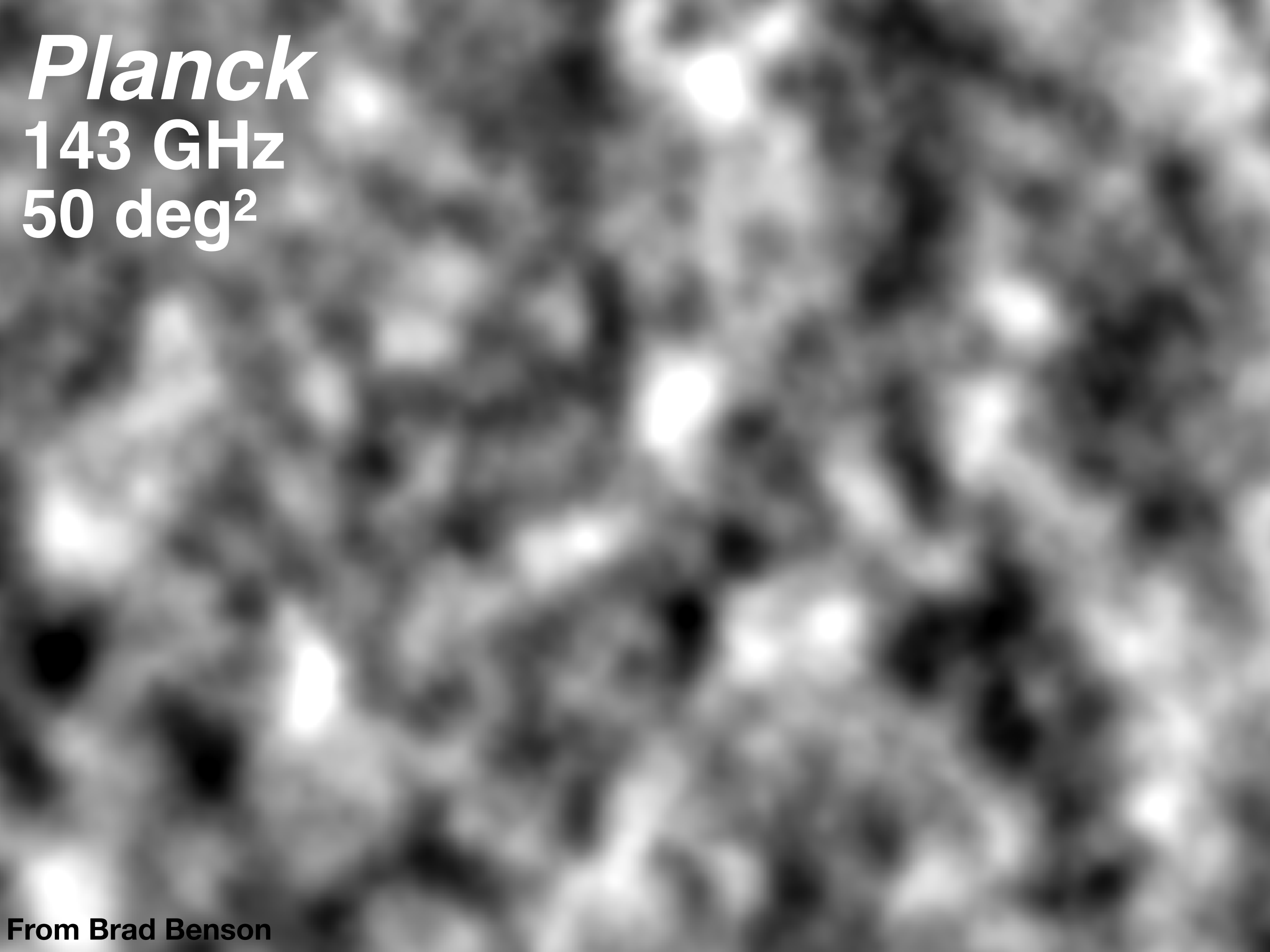


# Sunyaev-Zel'dovich Effect (1972)



- About 1% of CMB photons scatter
- SZE flux proportional to total thermal energy in the electron population
- SZE surface brightness is independent of redshift





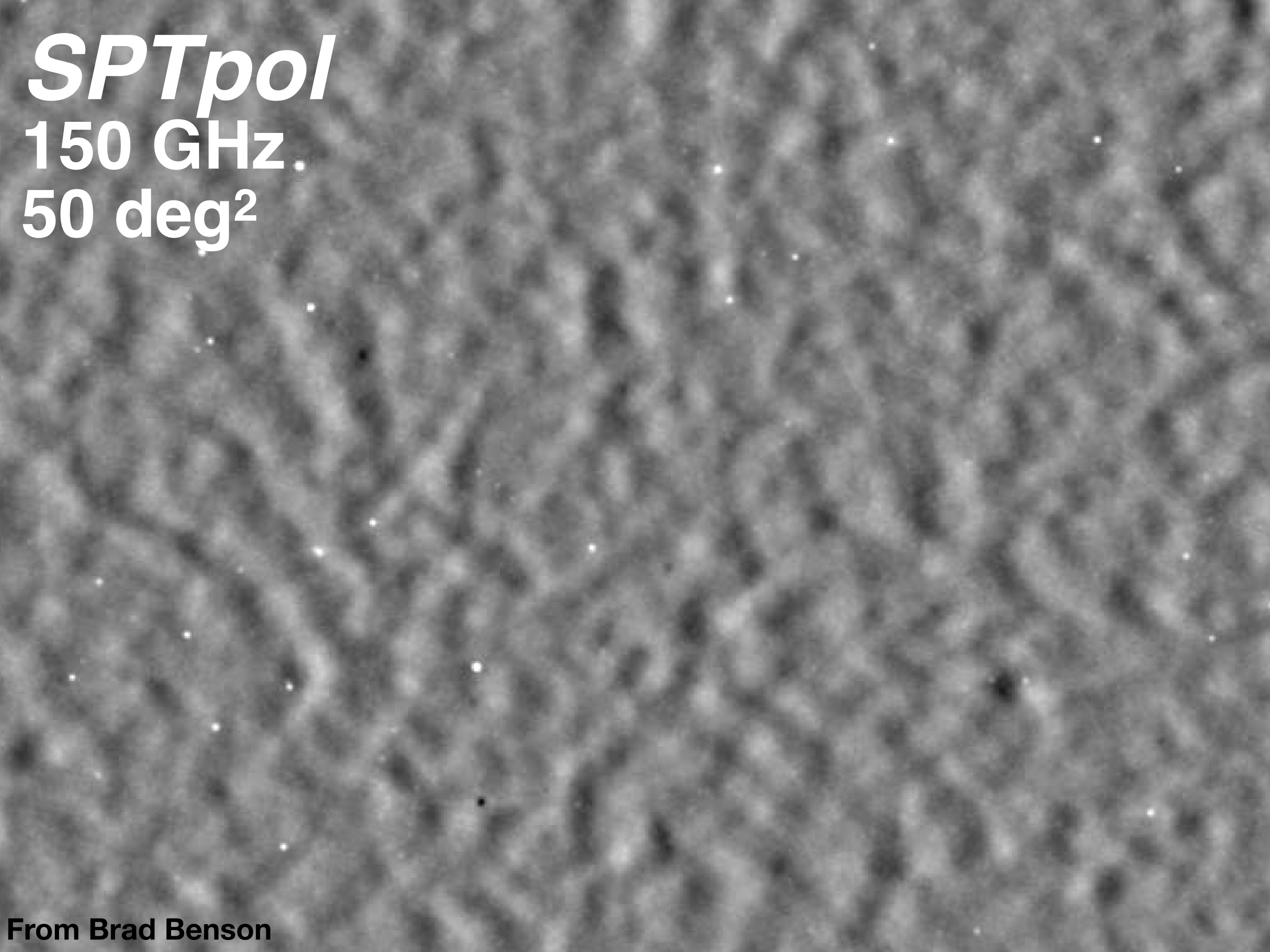
***Planck***  
**143 GHz**  
**50 deg<sup>2</sup>**



***SPTpol***  
**150 GHz**  
**50 deg<sup>2</sup>**

**6x finer angular  
resolution**  
**6x deeper**





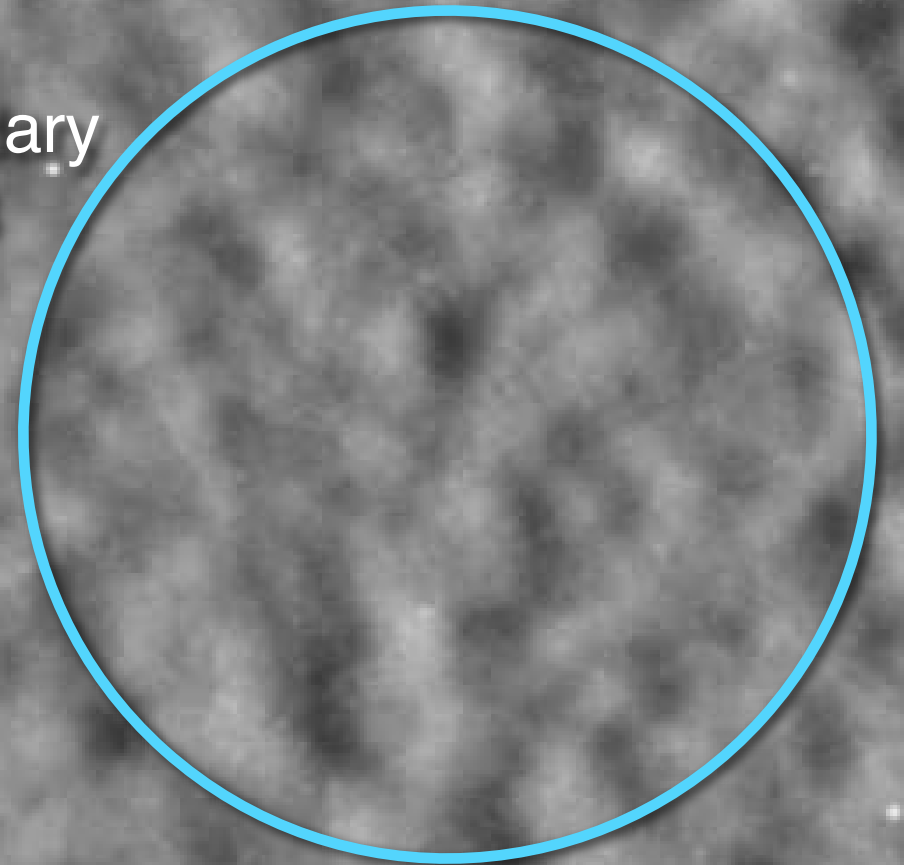
***SPTpol***  
**150 GHz**  
**50 deg<sup>2</sup>**

From Brad Benson

***SPTpol***  
**150 GHz**  
**50 deg<sup>2</sup>**

**CMB Anisotropy**

Primordial and secondary  
anisotropy in the CMB

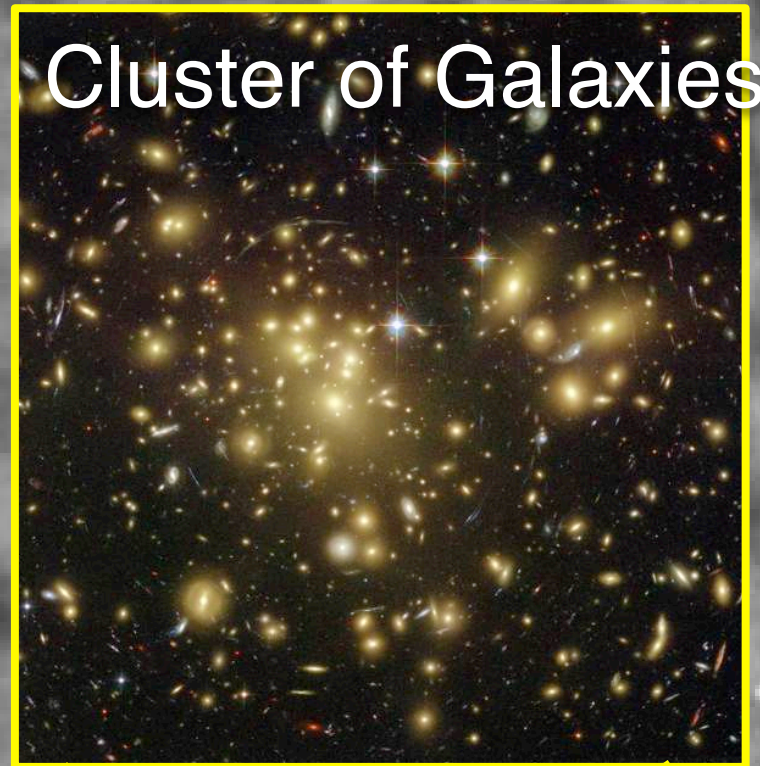


***SPTpol***  
**150 GHz**  
**50 deg<sup>2</sup>**

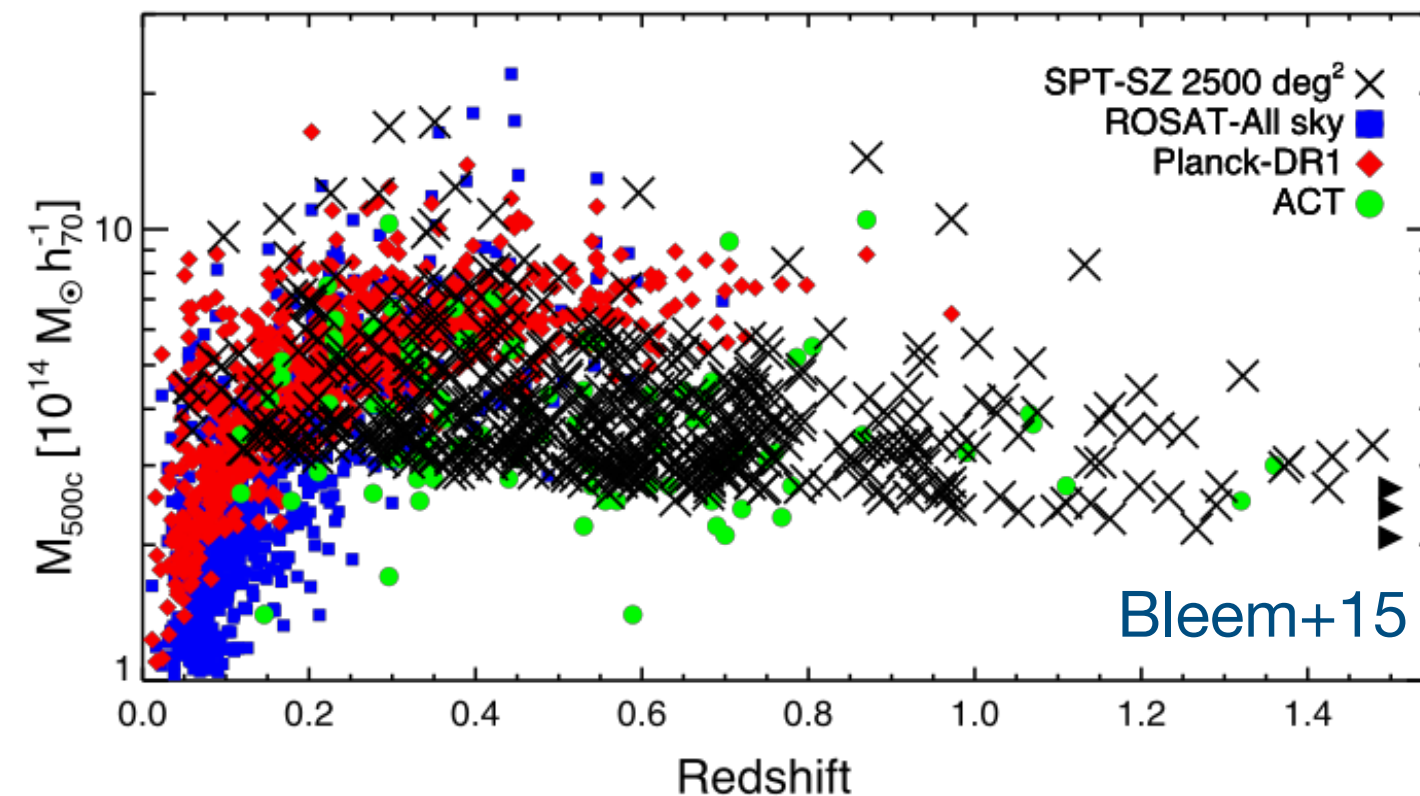
**Clusters of Galaxies**

“Shadows” in the microwave  
background from clusters of  
galaxies

Cluster of Galaxies



# SPT Cluster Catalogs

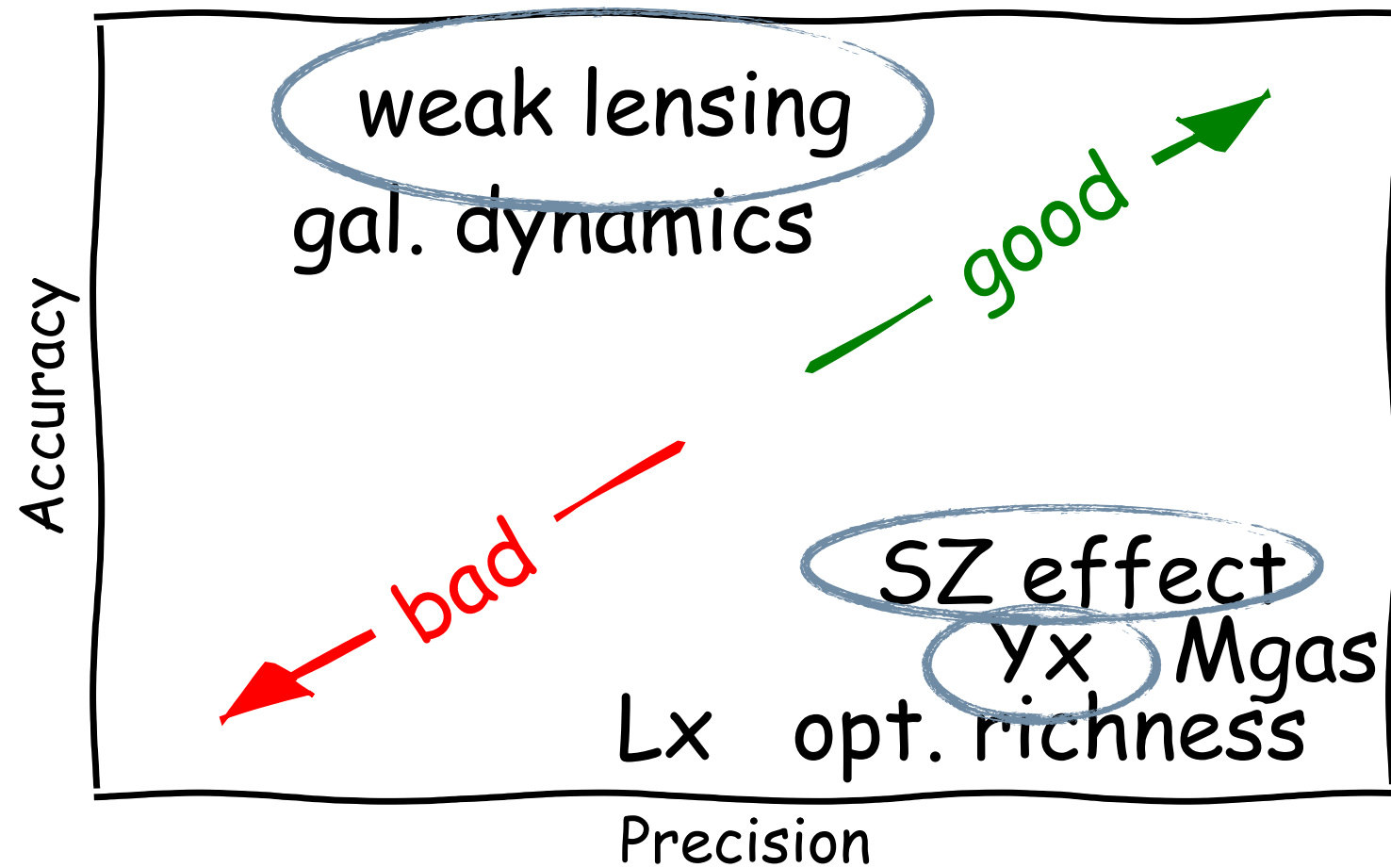


- High-resolution SZ survey means large redshift range
  - Galaxy populations
    - Zenteno+16, Hennig+17, Strazzullo+18
  - Galaxy dynamics
    - Ruel+14, Bocquet+15, Capasso+18
  - (X-ray) gas physics
    - Chiu+16,18, Bulbul+18, McDonald+13-18
  - Radio galaxies
    - Gupta+17
  - Cosmology
    - Benson+13, Reichardt+13, Bocquet+15, de Haan+16, Bocquet+18

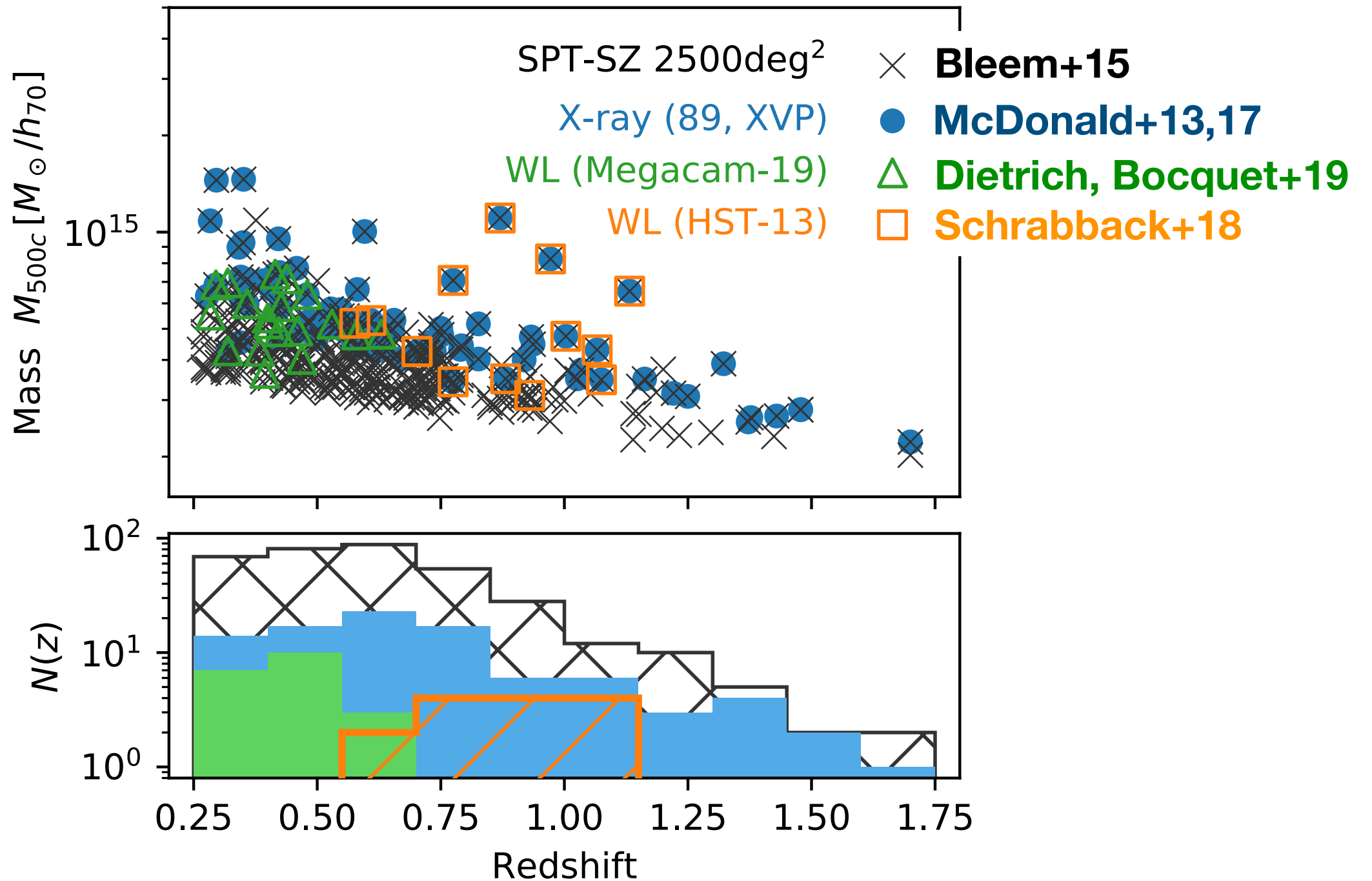


1. Cluster Cosmology in a Nutshell
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4. Outlook

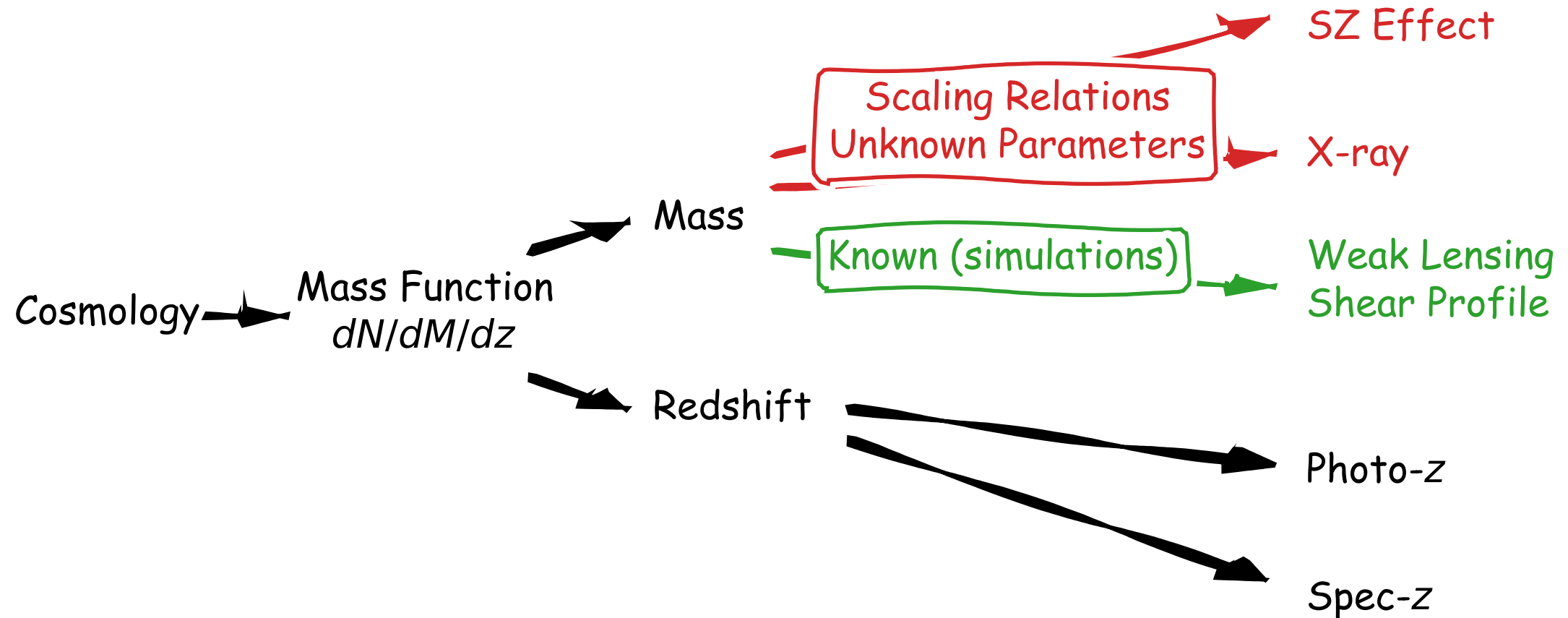
# Mass Proxies (Reminder)



# 2500 deg<sup>2</sup> SPT-SZ Survey Cluster Catalog and Multi-Observable Follow-up Data



# Mass Proxies and Observable—Mass Scaling Relation Calibration Strategy



Use the known relation  
**mass -> weak lensing shear profile**  
to calibrate  
**mass -> SZ effect** and **mass -> X-ray**

**Simultaneous analysis of all observables to capture all covariances**





- Mean scaling relation between SZ signal and mass is described by power-law in mass and redshift with a priori unknown parameters
- Simulation calibration of mass-to-WL shear profile (because we don't have perfectly centered NFW halos)
- Correlated intrinsic lognormal scatter in SZ, WL, and X-ray
- Halo mass function (theory prediction for halo abundance, Tinker+08)
  - Baryonic effects should not matter for us (explicitly shown in Bocquet+16, but see also Cui+14, Cusworth+14, Velliscig+14, Vogelsberger+14, Schaller+15)

# Weak-Lensing Bias and Scatter

Bocquet+ (arXiv: 1812.01679)



**We are limited by the low number of clusters with WL data, not systematics!**

Effect	Impact on Mass	
	Megacam	HST
WL mass bias	0.938	0.81 – 0.92
Intrinsic scatter	0.214	(0.26 – 0.42)
$\Delta$ (intrinsic scatter)	0.04	0.021 – 0.055
Uncorr. LSS scatter [ $M_{\odot}$ ]	$9 \times 10^{13}$	$8 \times 10^{13}$
$\Delta$ (Uncorr. LSS scatter) [ $M_{\odot}$ ]	$10^{13}$	$10^{13}$
Mass modeling uncertainty	4.4%	5.8 – 6.1%
Systematic measurement uncert.	3.5%	7.2%
Total systematic uncertainty	5.6%	9.2 – 9.4%

**19 clusters    13 clusters**

# Likelihood function

Poisson likelihood for cluster abundance

Selection  
xi >5, z>0.25

HMF

$$\ln \mathcal{L}(\vec{p}) = \sum_i \ln \frac{dN(\xi, z, \vec{p})}{d\xi dz} \Big|_{\xi_i, z_i} - \iint d\xi dz \Theta_{\text{survey}} \frac{dN(\xi, z, \vec{p})}{d\xi dz} + \sum_j P(Y_X, g_t | \xi_j, z_j, \vec{p}) \Big|_{Y_{X_j}, g_{tj}}$$

Mass calibration

$$\frac{dN(\xi, z | \mathbf{p})}{d\xi dz} = \iint dM d\zeta \left[ P(\xi | \zeta) P(\zeta | M, z, \mathbf{p}) \frac{dN(M, z | \mathbf{p})}{dM dz} \Omega(z, \mathbf{p}) \right]$$

$$P(Y_X^{\text{obs}}, g_t^{\text{obs}} | \xi, z, \mathbf{p}) = \iiint dM d\zeta dY_X dM_{\text{WL}} \left[ P(Y_X^{\text{obs}} | Y_X) P(g_t^{\text{obs}} | M_{\text{WL}}) P(\xi | \zeta) P(\zeta, Y_X, M_{\text{WL}} | M, z, \mathbf{p}) P(M | z, \mathbf{p}) \right]$$

# Parameters and Priors

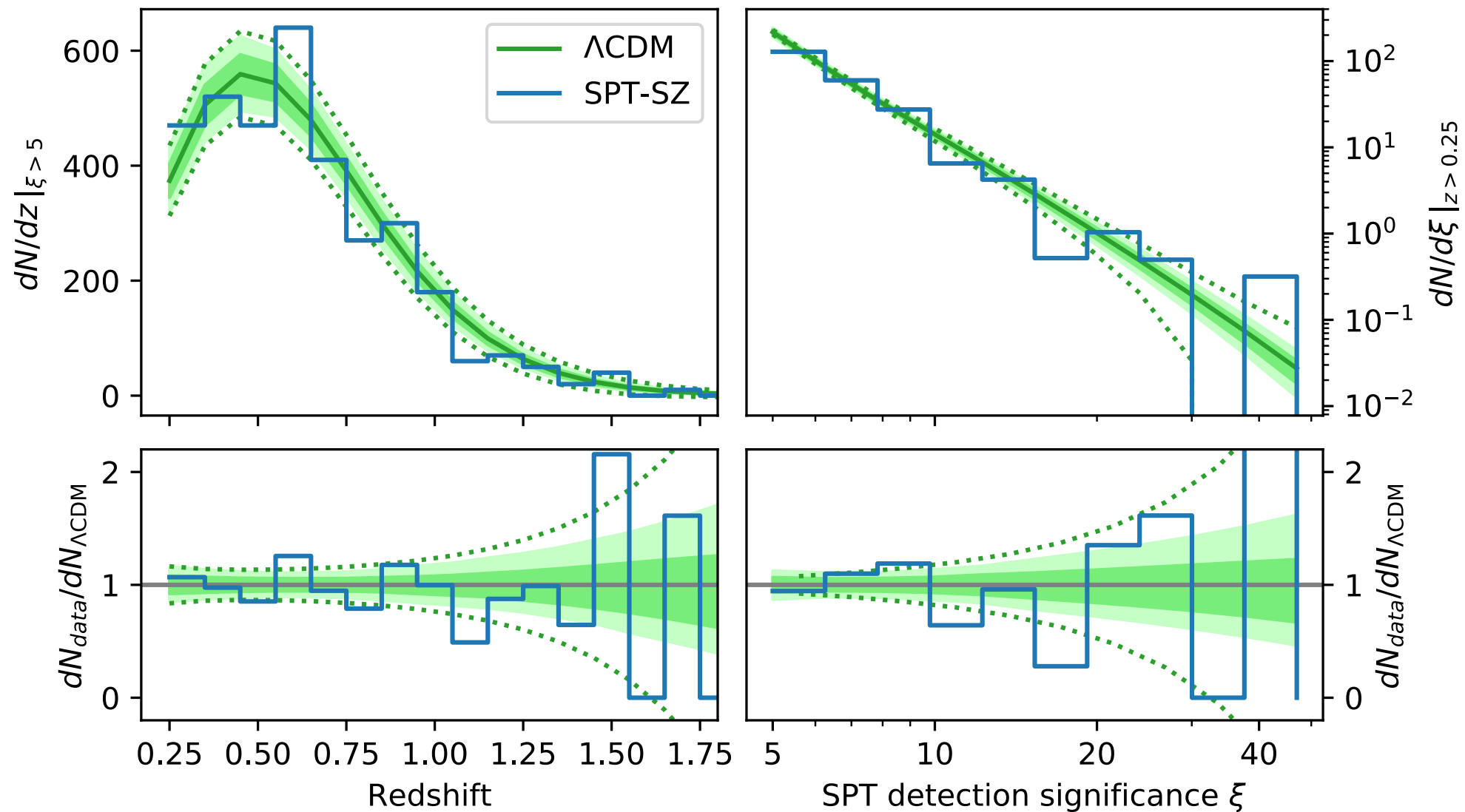
Bocquet+ (arXiv: 1812.01679)

Parameter	Prior
Cosmological	
$\Omega_m$	$\mathcal{U}(0.05, 0.6), \Omega_m(z > 0.25) > 0.156$
$\Omega_b h^2$	$\mathcal{U}(0.020, 0.024)$
$\Omega_\nu h^2$	$\mathcal{U}(0, 0.01)$
$\Omega_k$	fixed (0)
$A_s$	$\mathcal{U}(10^{-10}, 10^{-8})$
$h$	$\mathcal{U}(0.55, 0.9)$
$n_s$	$\mathcal{U}(0.94, 1.00)$
$w$	fixed $(-1)$ or $\mathcal{U}(-2.5, -0.33)$
Optical depth to reionization	
$\tau$	fixed or $\mathcal{U}(0.02, 0.14)$
SZ scaling relation	
$A_{\text{SZ}}$	$\mathcal{U}(1, 10)$
$B_{\text{SZ}}$	$\mathcal{U}(1, 2.5)$
$C_{\text{SZ}}$	$\mathcal{U}(-1, 2.5)$
$\sigma_{\ln \zeta}$	$\mathcal{U}(0.01, 0.5) (\times \mathcal{N}(0.13, 0.13^2))$
X-ray $Y_X$ scaling relation	
$A_{Y_X}$	$\mathcal{U}(3, 10)$
$B_{Y_X}$	$\mathcal{U}(0.3, 0.9)$
$C_{Y_X}$	$\mathcal{U}(-1, 0.5)$
$\sigma_{\ln Y_X}$	$\mathcal{U}(0.01, 0.5)$
$d \ln M_g / d \ln r$	$\mathcal{U}(0.4, 1.8) \times \mathcal{N}(1.12, 0.23^2)$
WL modeling	
$\delta_{\text{WL,bias}}$	$\mathcal{U}(-3, 3) \times \mathcal{N}(0, 1)$
$\delta_{\text{Megacam}}$	$\mathcal{U}(-3, 3) \times \mathcal{N}(0, 1)$
$\delta_{\text{HST}}$	$\mathcal{U}(-3, 3) \times \mathcal{N}(0, 1)$
$\delta_{\text{WL,scatter}}$	$\mathcal{U}(-3, 3) \times \mathcal{N}(0, 1)$
$\sigma_{\text{WL,LSS}_{\text{Megacam}}}$	$\mathcal{U}(-3, 3) \times \mathcal{N}(0, 1)$
$\sigma_{\text{WL,LSS}_{\text{HST}}}$	$\mathcal{U}(-3, 3) \times \mathcal{N}(0, 1)$
Correlated scatter	
$\rho_{\text{SZ-WL}}$	$\mathcal{U}(0, 1)$
$\rho_{\text{SZ-X}}$	$\mathcal{U}(0, 1)$
$\rho_{\text{X-WL}}$	$\mathcal{U}(0, 1)$
	$\det(\Sigma) > 0$



# Goodness of Fit Test: Passed

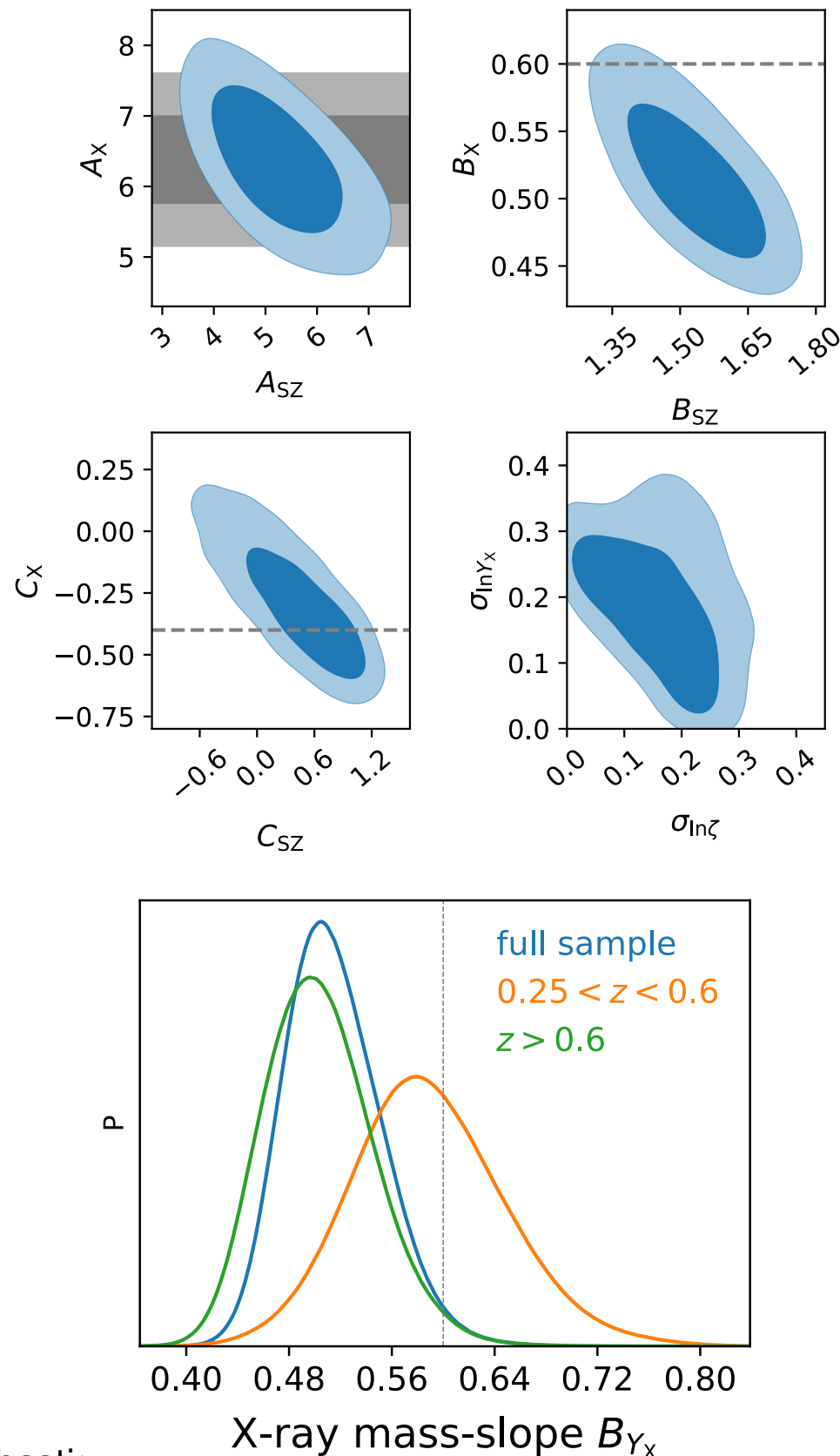
Bocquet+ (arXiv: 1812.01679)



- Number counts test statistic (Kaastra 17)
  - $C(\text{model}) = 439.8 \pm 26.8$
  - $C(\text{data}) = 449.3$

# X-ray Scaling Relation

Bocquet+ (arXiv: 1812.01679)



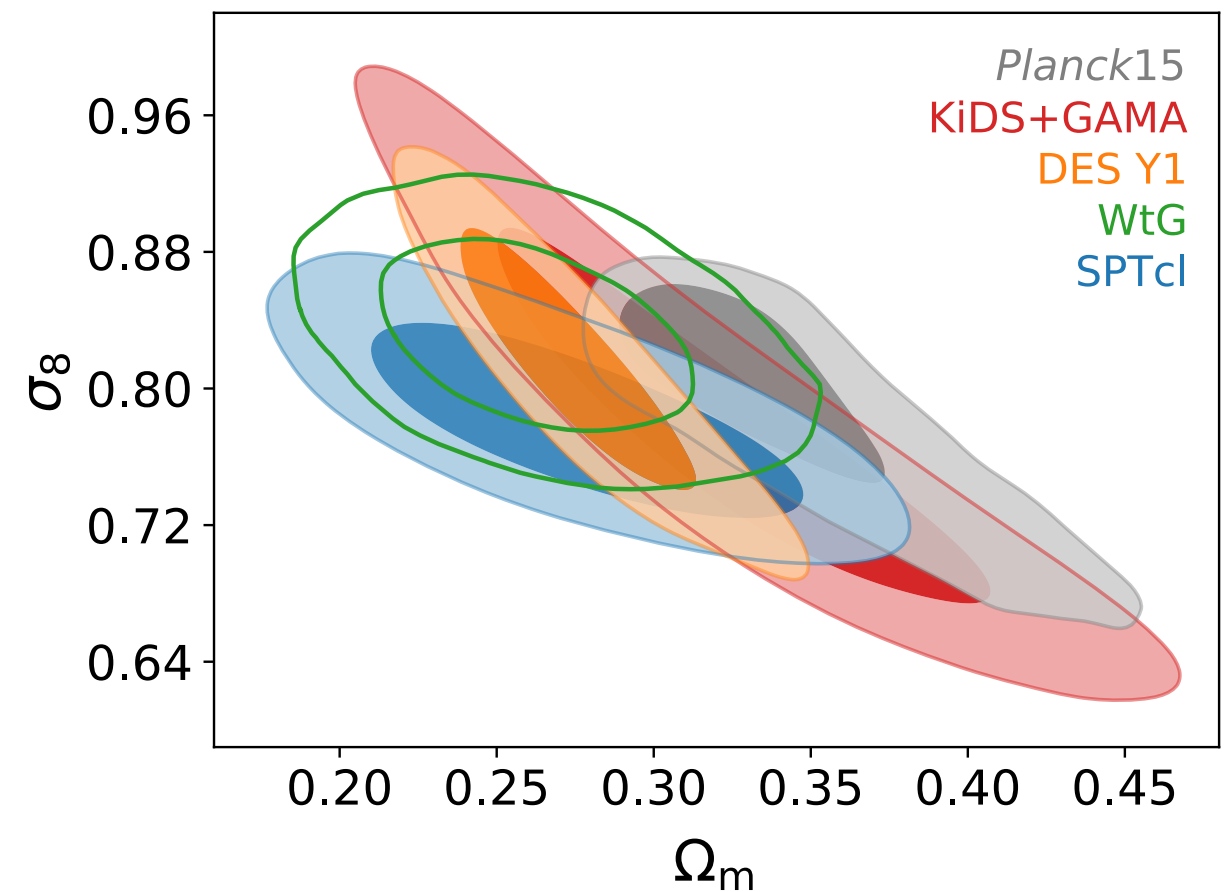
- Constraints on X-ray scaling relations as a “byproduct”
- **Why care: This feeds back into hydro simulations!**
- Self-similar model prediction if non-thermal pressure support is negligible
- Redshift evolution is self-similar
- Mass evolution is steeper than self-similar
  - Low-redshift half ( $0.25 < z < 0.6$ ) in  $< 1 \sigma$  agreement with the standard self-similar evolution
  - High-redshift half ( $z > 0.6$ ) shows signs of departure at  $\sim 3 \sigma$  level
- Very similar story when using  $M_{\text{gas}}$  instead of  $Y_X$

# LCDM with varying sum of neutrino masses

Bocquet+ (arXiv: 1812.01679)

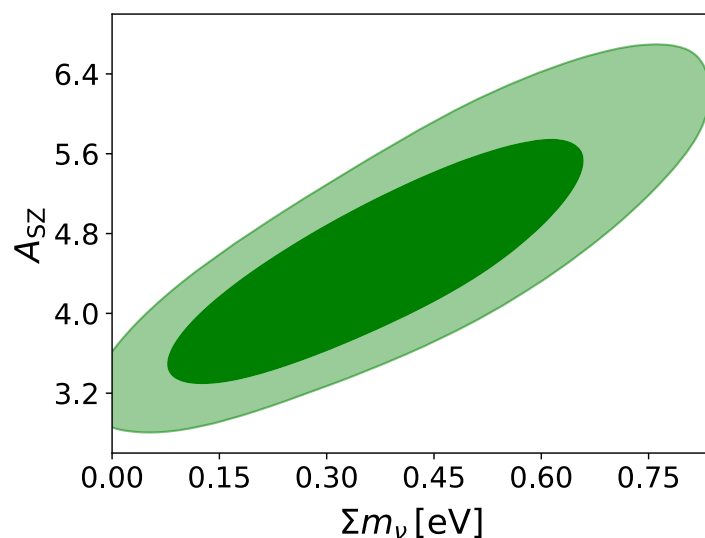
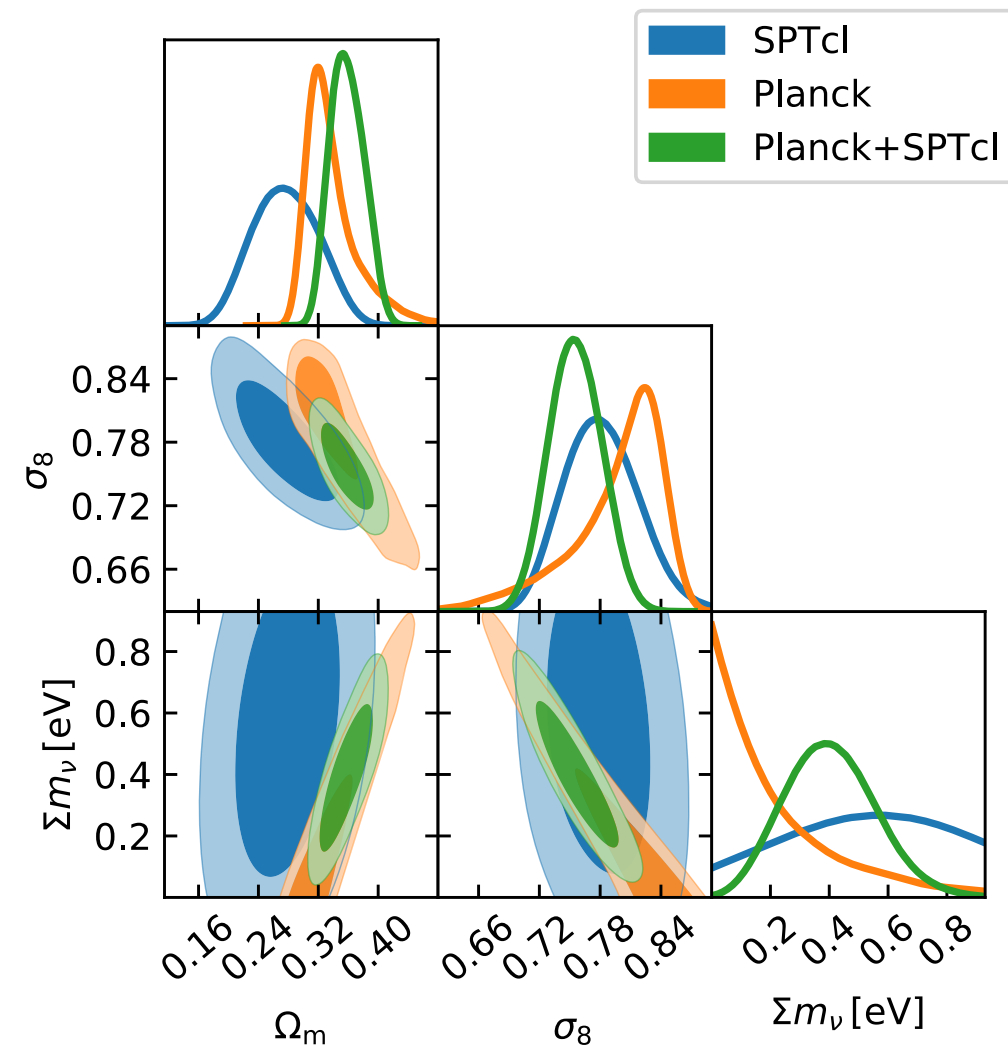


- Wide flat priors on SZ scaling relation parameters fully encompass posterior
- Cluster constraint statistically limited by mass calibration: need more (weak lensing) data! (currently 32 clusters)
- $1.5\sigma$  agreement with *Planck* TT+lowTEB

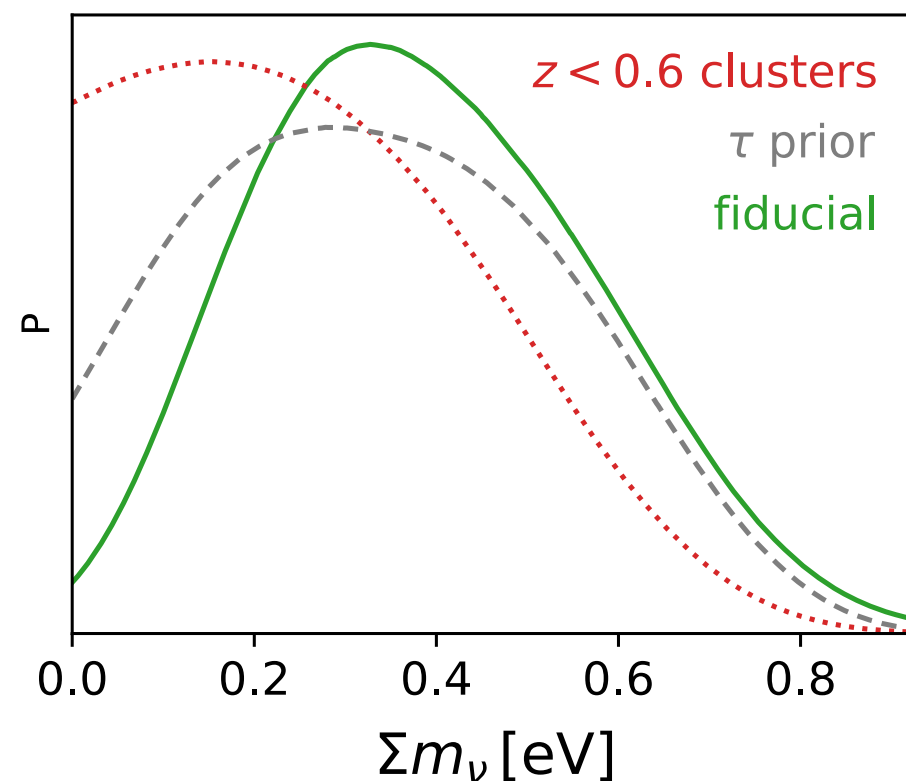


# Neutrino Masses

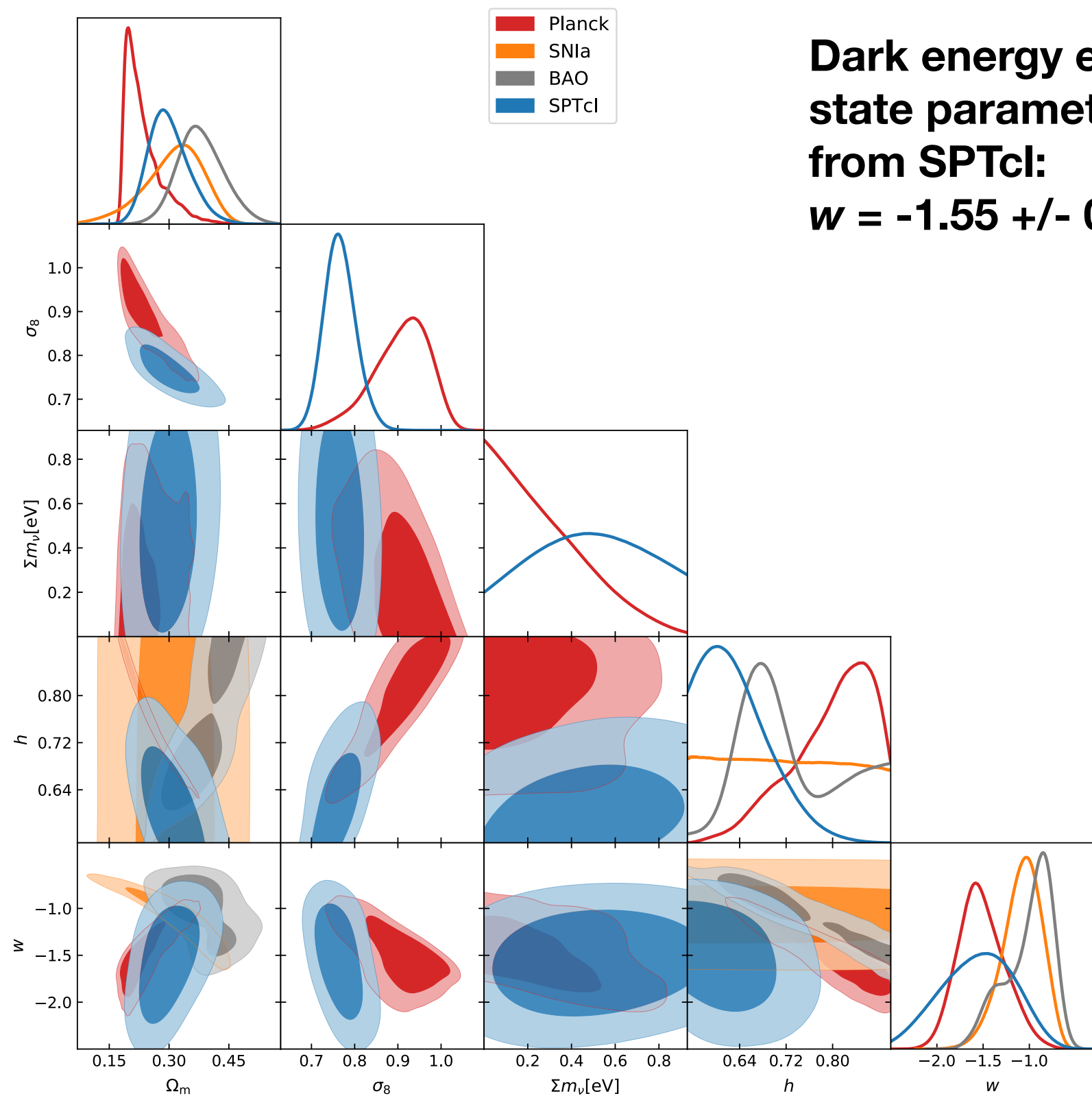
Bocquet+ (arXiv: 1812.01679)



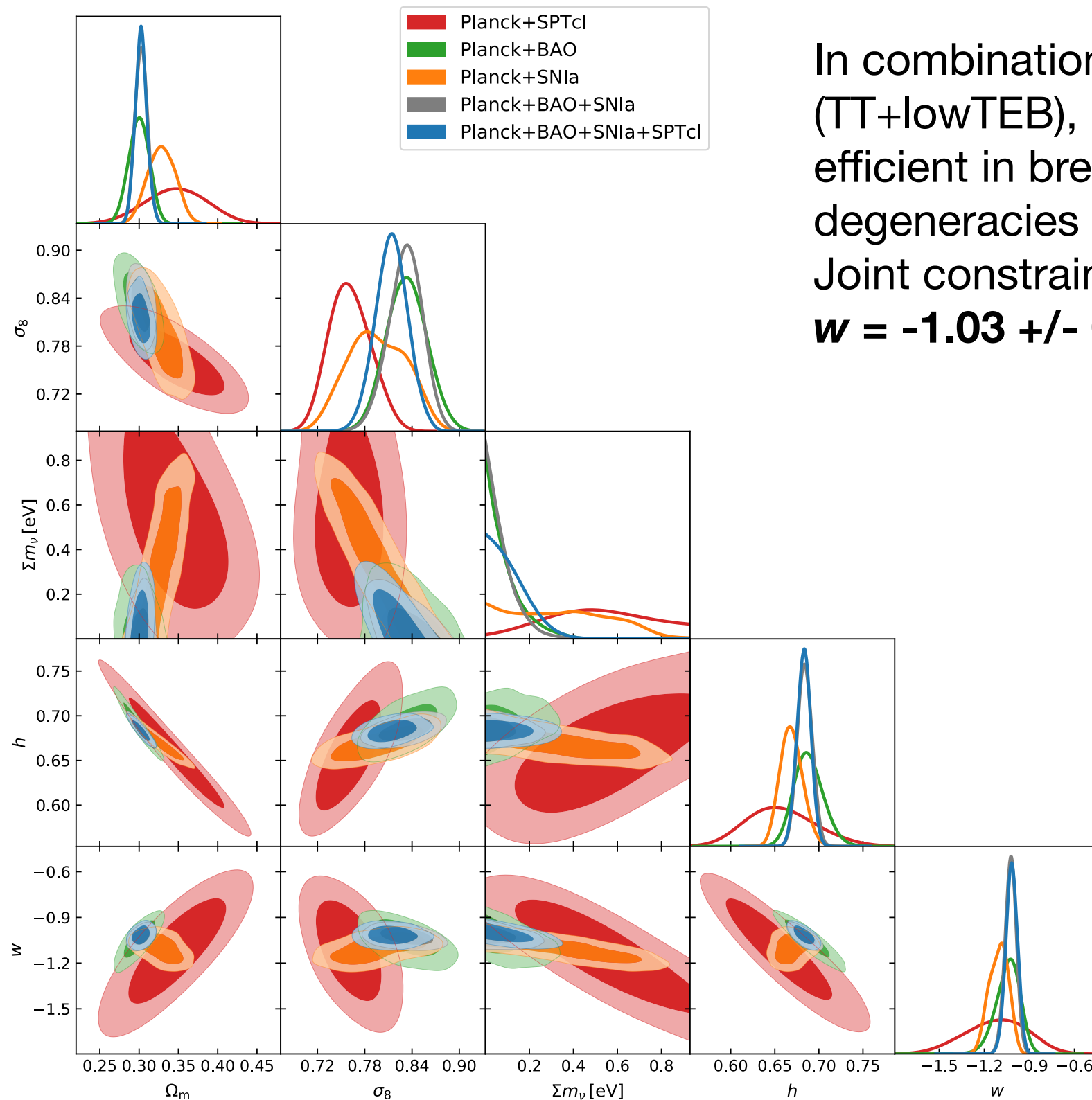
- Combination with Planck primary CMB measurements yields  $2\sigma$  preference for non-zero sum of neutrino masses
- Again, limited by mass calibration uncertainties
- Using  $\tau$  prior from Planck 2018 gives  $1.7\sigma$  preference
- Using only the  $z < 0.6$  cluster sample gives no preference for non-zero sum of neutrino masses







**Dark energy equation of state parameter from SPTcl:**  
 **$w = -1.55 \pm 0.41$**



In combination with Planck (TT+lowTEB), SPTcl is not as efficient in breaking degeneracies as BAO or SNla. Joint constraint:

$$w = -1.03 \pm 0.04$$

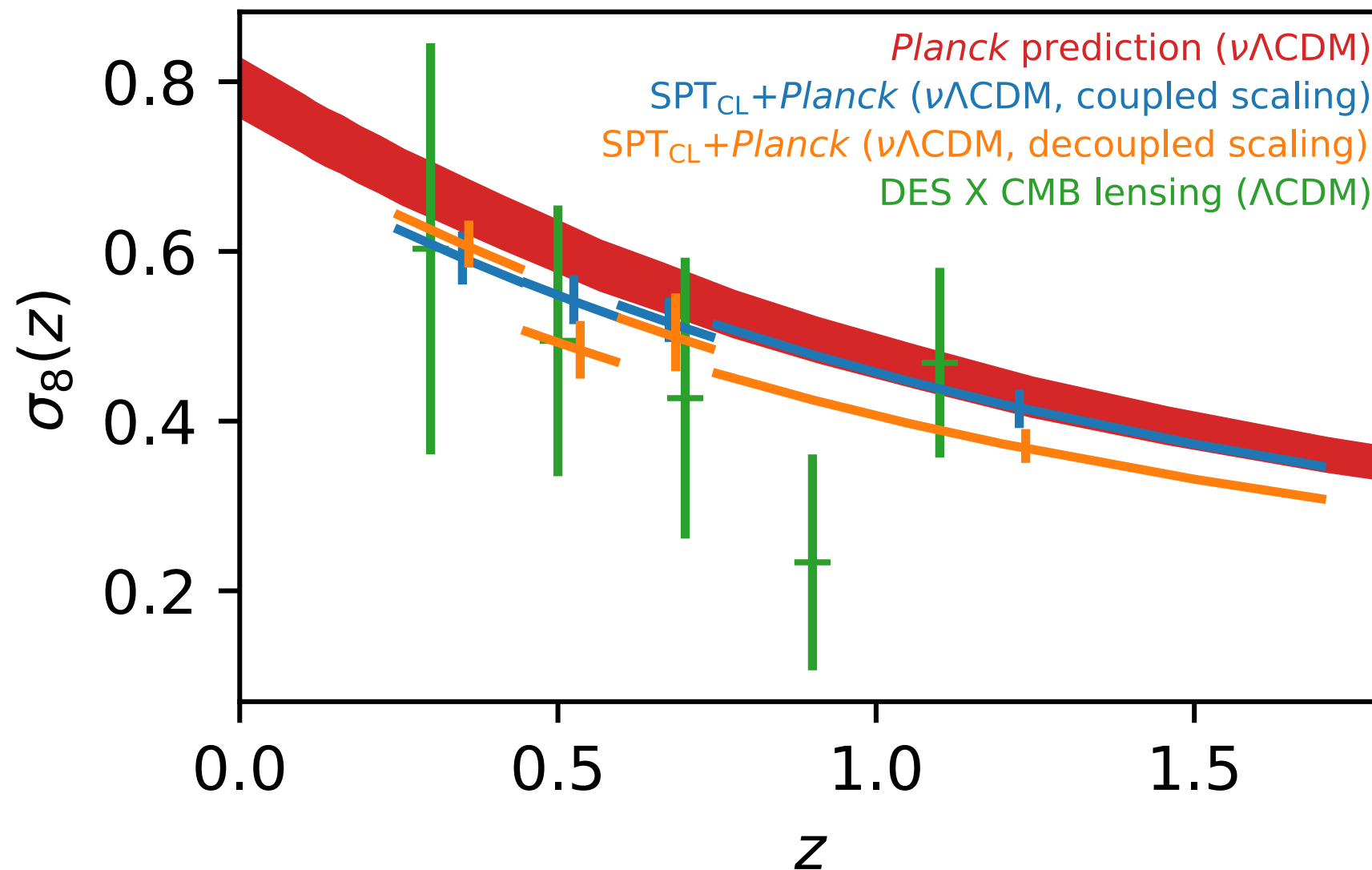
# Linear Growth of Structure

Bocquet+ (arXiv: 1812.01679)



**Blue error bars:** *Planck* constrains the geometry of the Universe only, clusters constrain growth.

**Orange error bars:** More freedom in mass—observable relation



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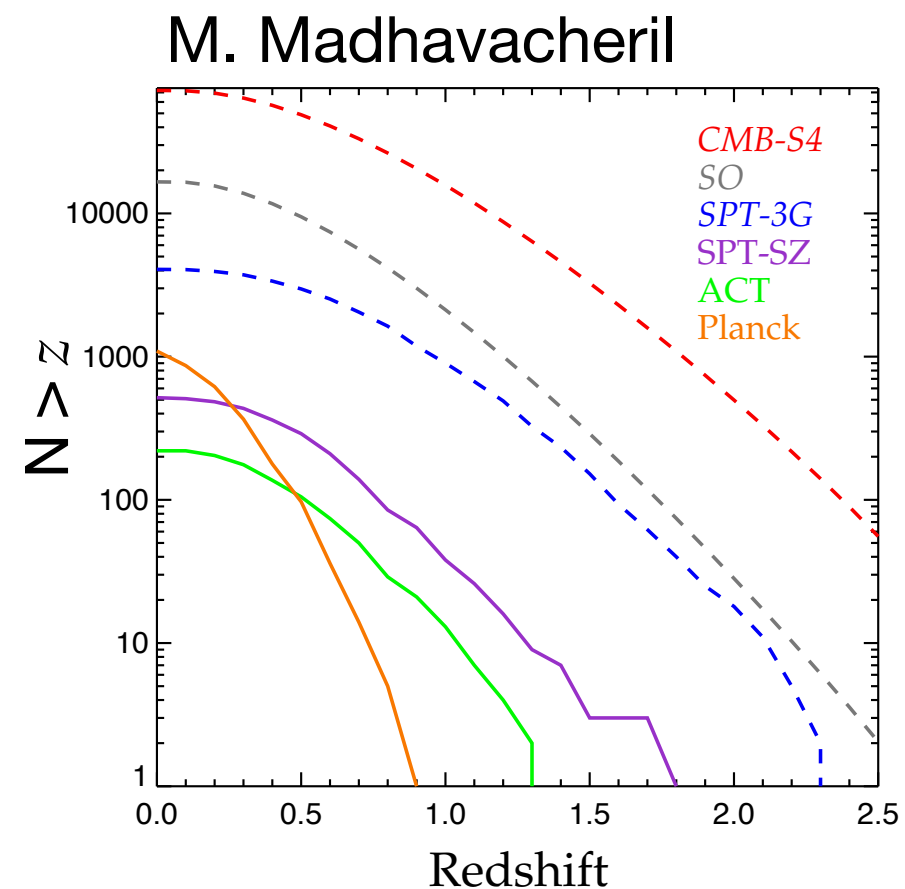
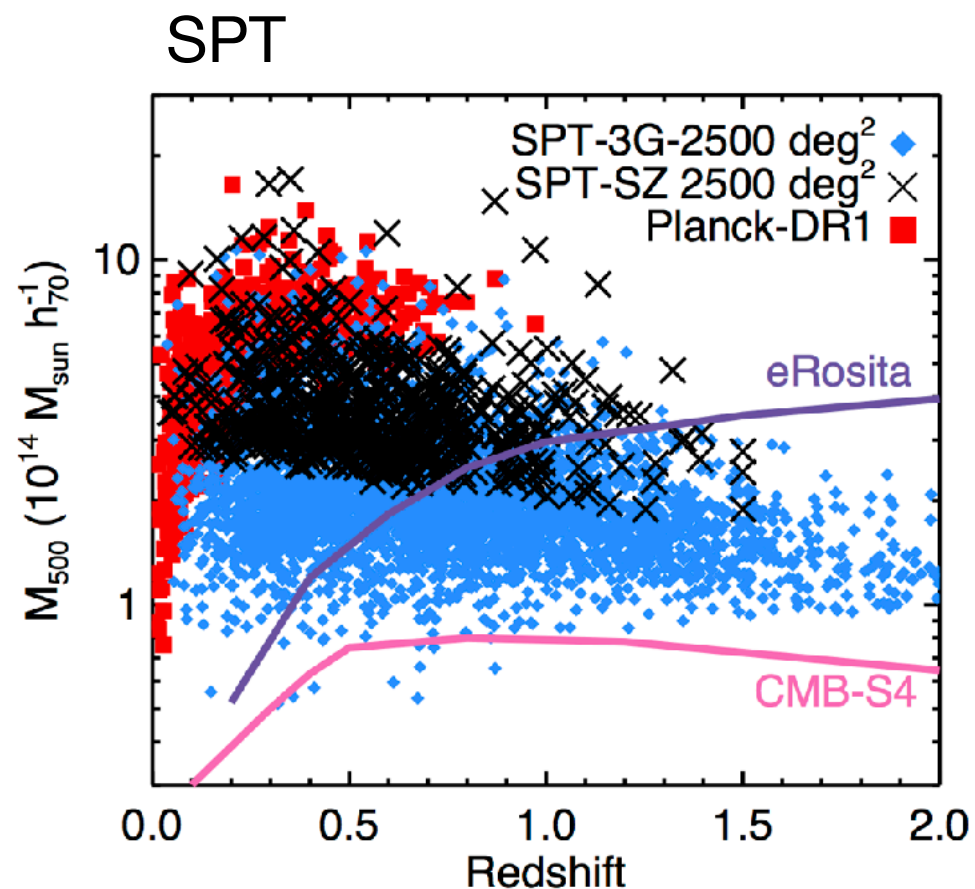
# Outlook: Ongoing Work

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- Weak-lensing mass calibration of SPT clusters
  - Currently limited by number of WL observations
  - Use overlap of SPT and the Dark Energy Survey (DES) to get WL data for all SPT clusters at  $z < \sim 1$  (Paulus, Bocquet, Mohr+ in prep.)
  - Ongoing HST programs for high- $z$  clusters
- SPTpol (2nd generation camera) analyses ongoing
  - Wide survey extension (another 2500 square deg: SPECS)
  - Main, deep fields: Push to lower-mass clusters (more abundant)
- SPT-3G: deep 1500 square degree survey

# Outlook: Future Cluster Samples from CMB

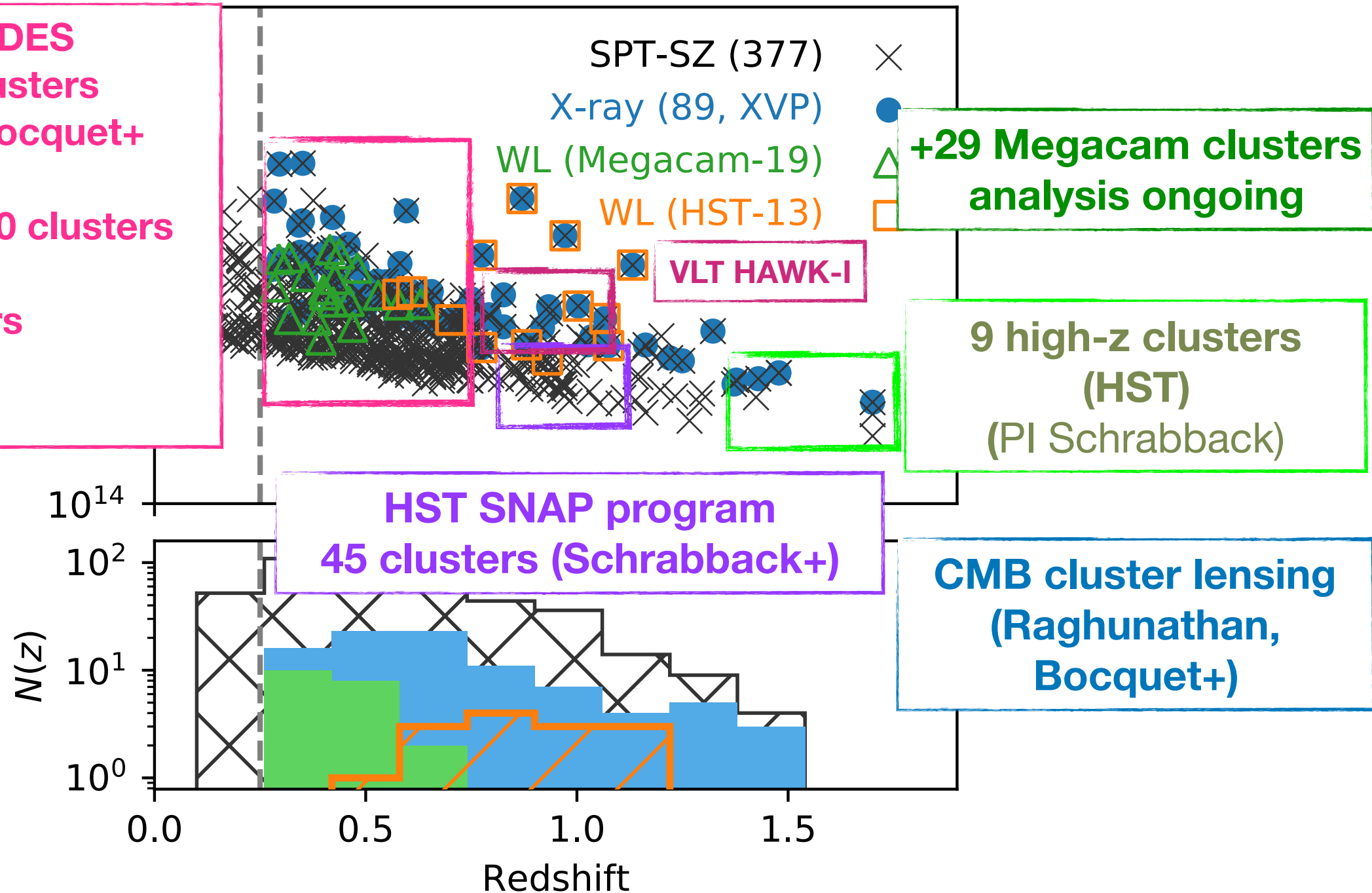


# OUTLOOK: ONGOING (OPTICAL) WEAK LENSING FOLLOW-UP



## WL calibration from DES

- SV 200deg<sup>2</sup>: 34 clusters (Stern, Dietrich, Bocquet+ 2018)
- Y1 1500 deg<sup>2</sup>: ~200 clusters (Maria Paulus)
- Y3: all SPT clusters @  $z < \sim 0.7$  (Maria Paulus)





# Summary

- Data-driven cosmology from SPT galaxy clusters
- WL data plays key role
- WL sample is expanding thanks to the Dark Energy Survey, HST programs, and CMB lensing
- Next-gen CMB surveys ongoing and planned
  - SPTpol, SPT-3G
  - Advanced ACTpol
  - Simons Observatory
  - CCAT-prime
  - CMB-S4

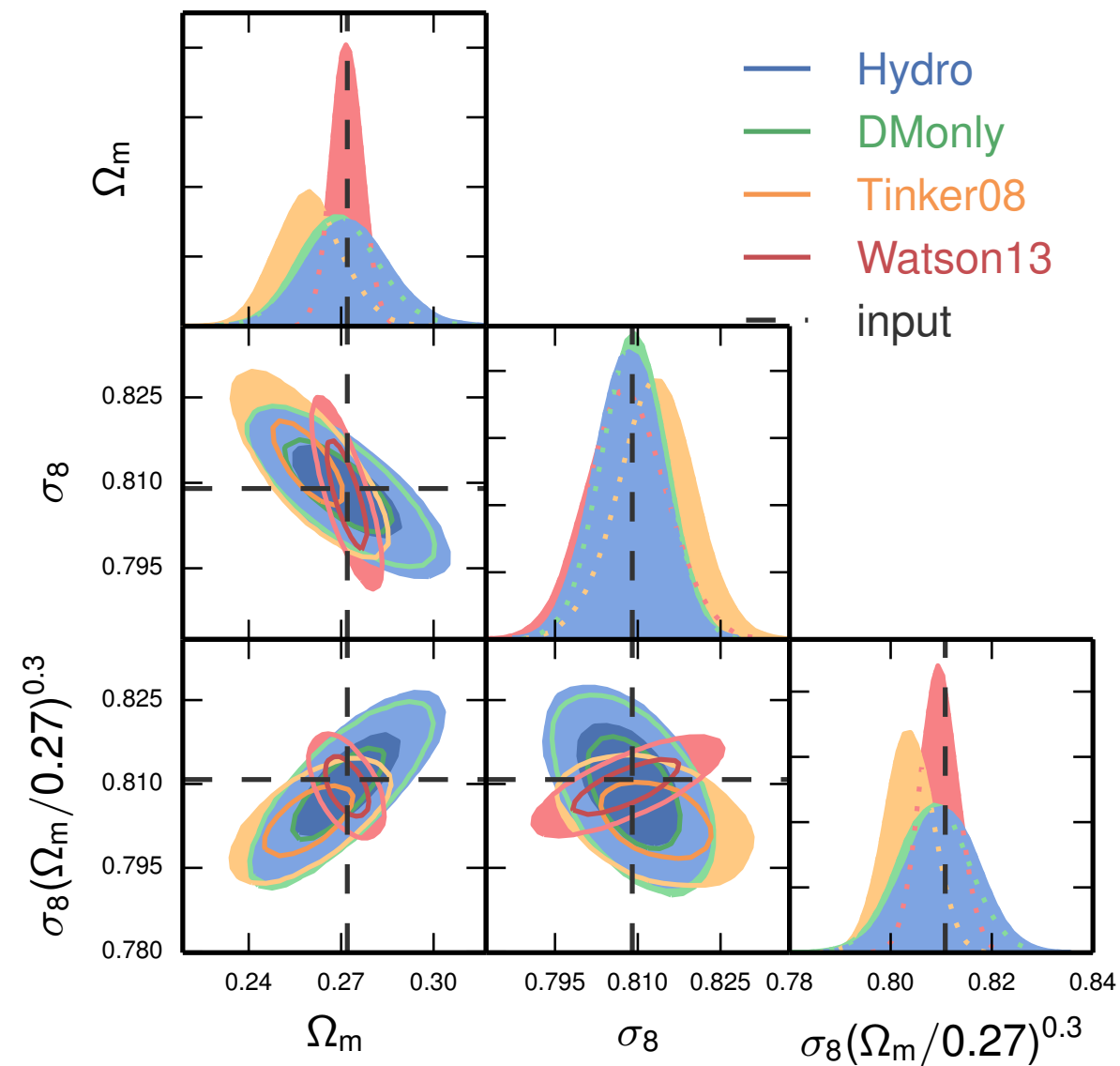




**Backup slides...**

# Impact of hydro HMF for SPT

Bocquet+ (2016), MNRAS 456, 2361 (arXiv: 1502.07357)



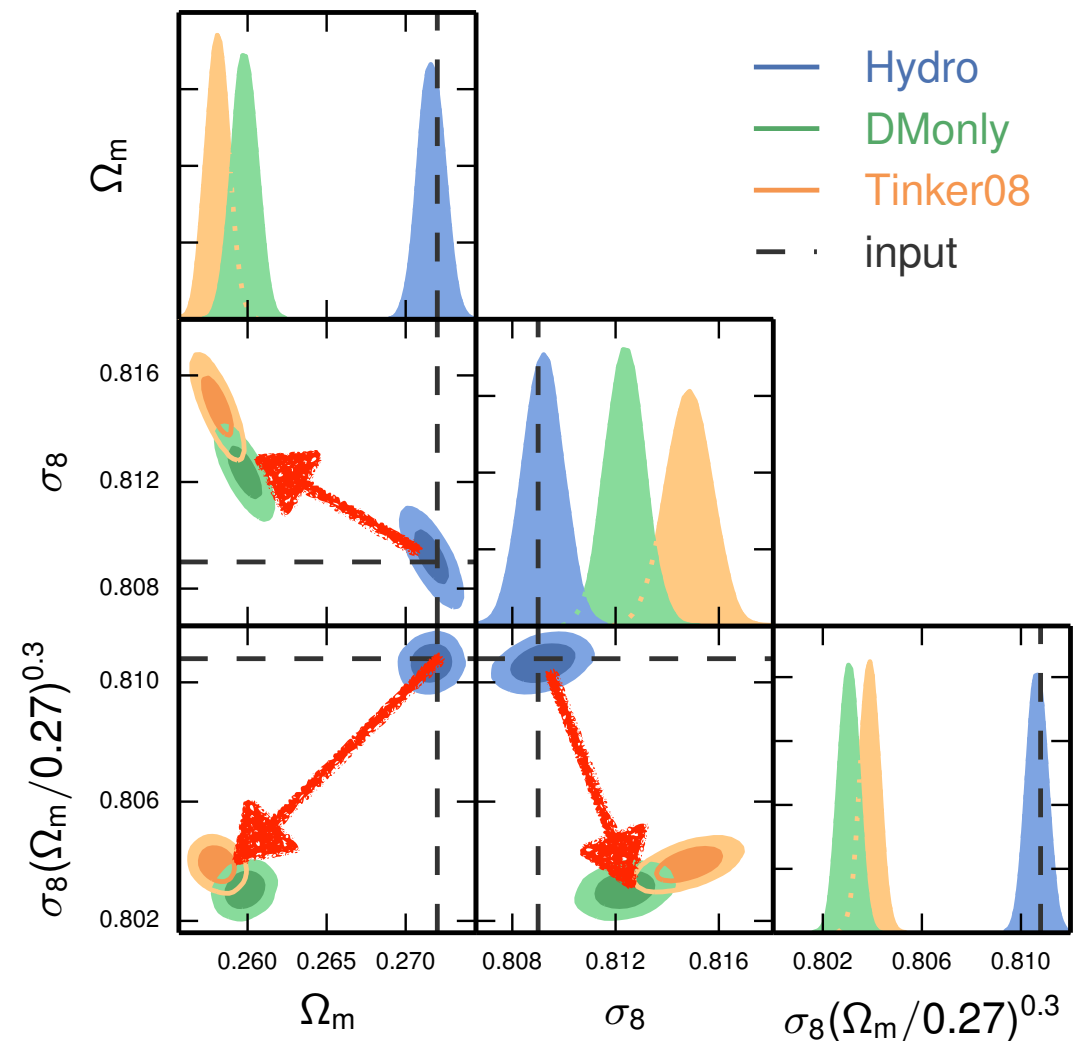
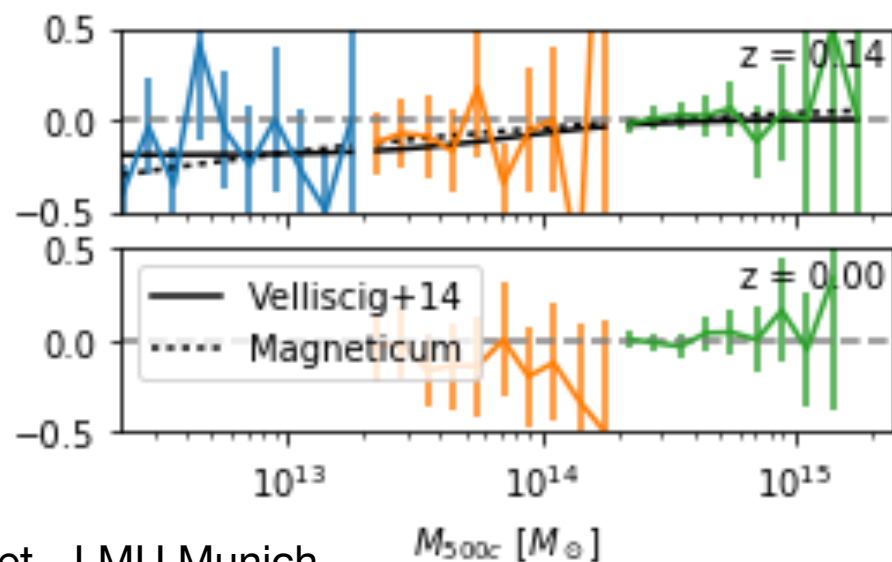
***Magneticum Pathfinder* hydro simulations (Dolag et al.)**

# Baryons and the Halo Mass Function

Bocquet+ (2016), MNRAS 456, 2361 (arXiv: 1502.07357)



- At fixed halo mass, feedback processes change the abundance
- Use hydrodynamical *Magneticum Pathfinder* simulation suite
- Up to  $(2688 \text{ Mpc}/h)^3$  to sample high-mass halos
- Hydro effects are important for upcoming studies using  $M < \sim 1e14 \text{ Msun}$



**Biases if effect of hydro is ignored for eROSITA-like surveys!**

# Cosmology dependence of halo mass function



- Current approach: extrapolate cosmology dependence
- Use 26 (2 & 5 Gpc)<sup>3</sup> simulations covering 8 cosmo params and “interpolate” using Gaussian process (Bocquet, Habib, Heitmann+ in prep.)
- See also Habib+07, Heitmann+ 16, McClintock+18, Nishimichi+19

