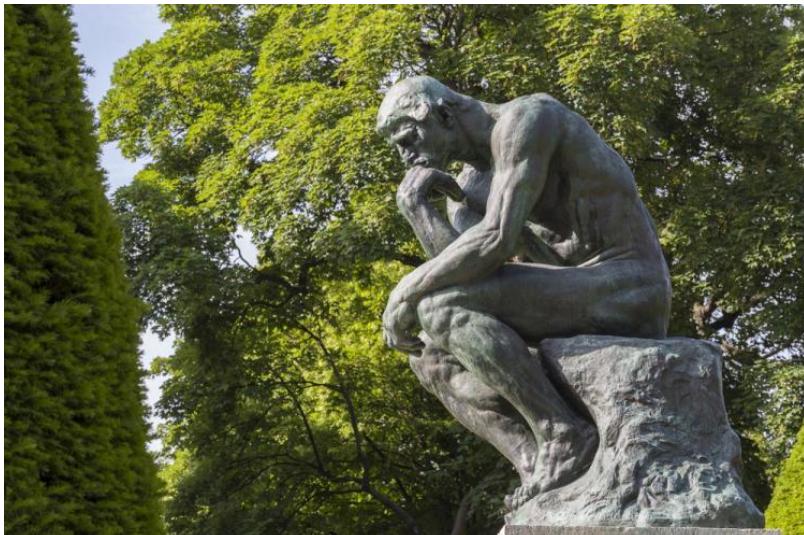
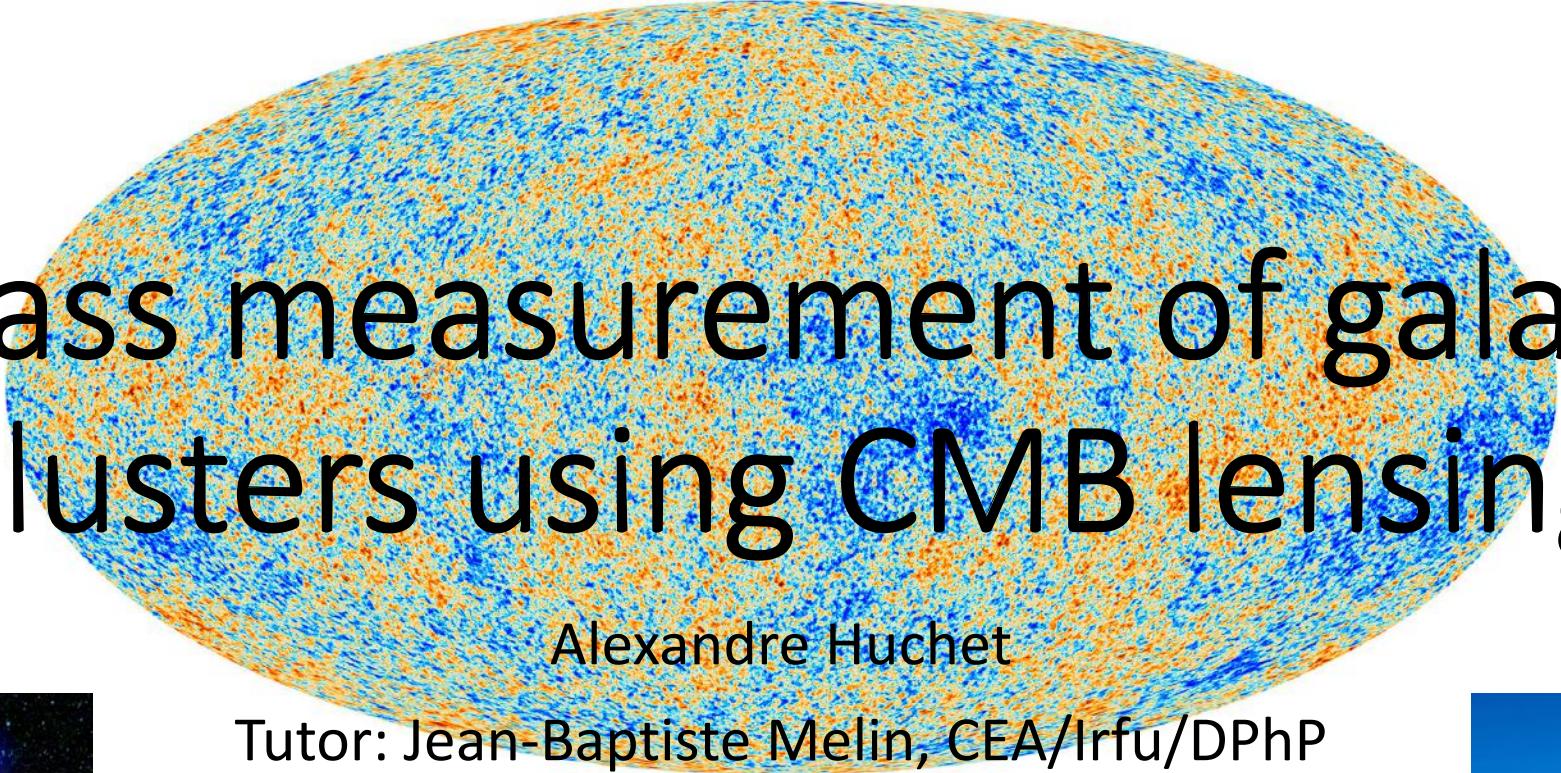




# To be determined

Life of a PhD student through hardships

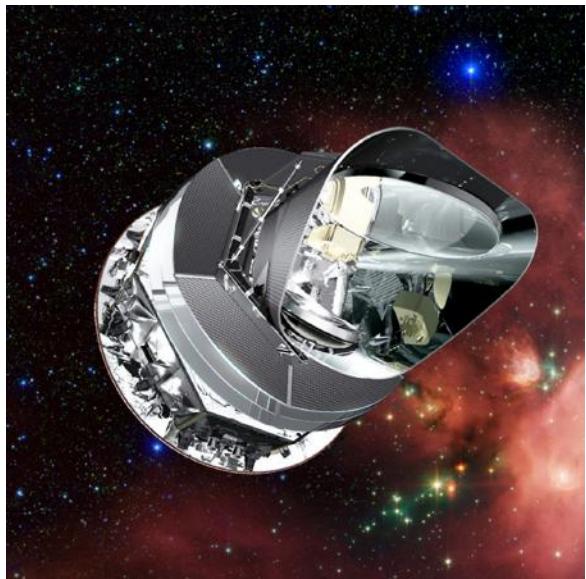




# Mass measurement of galaxy clusters using CMB lensing

Alexandre Huchet

Tutor: Jean-Baptiste Melin, CEA/Irfu/DPhP

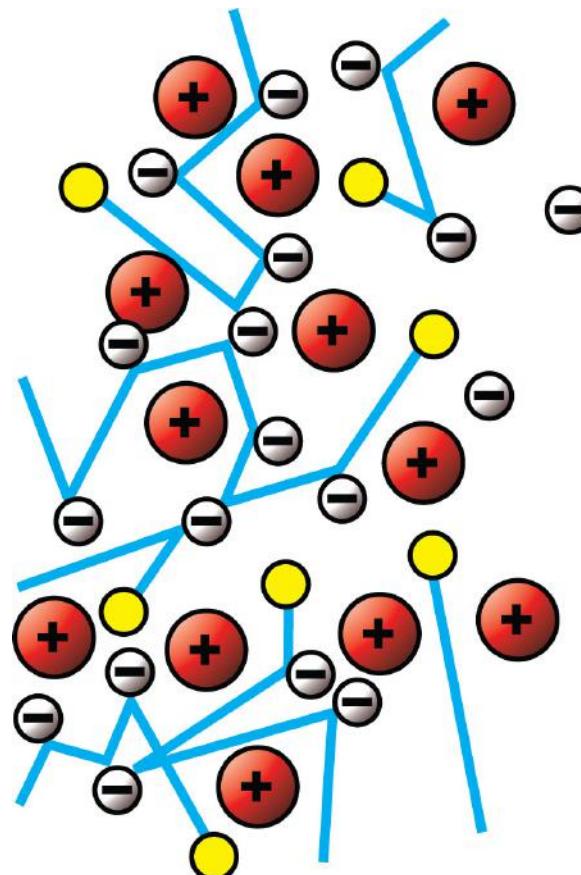


# Mass measurement of galaxy clusters using CMB lensing

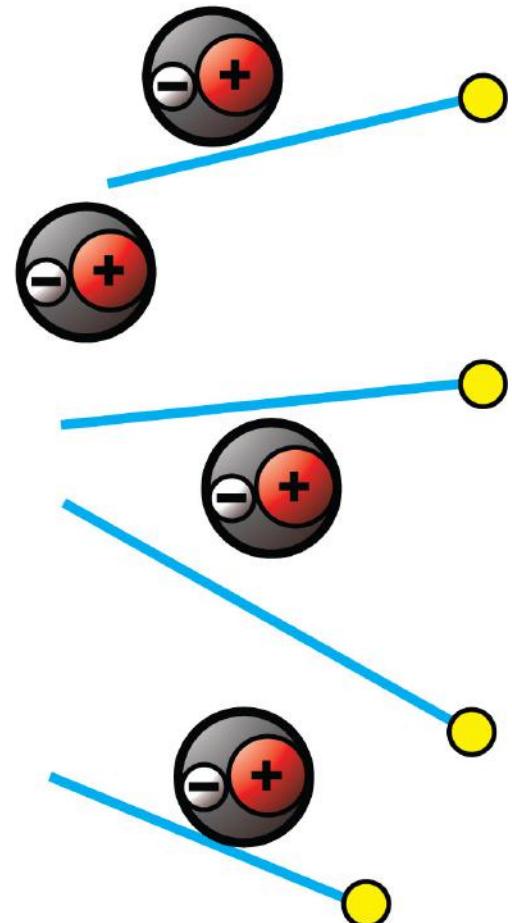
Let's see what that means

# The CMB

- The Cosmic Microwave Background (CMB) was emitted about 13.4 billion years ago
- It got cooler because of the expansion of the Universe:  
 $3000\text{ K} \rightarrow 2.7\text{ K}$



Credit: Write Science

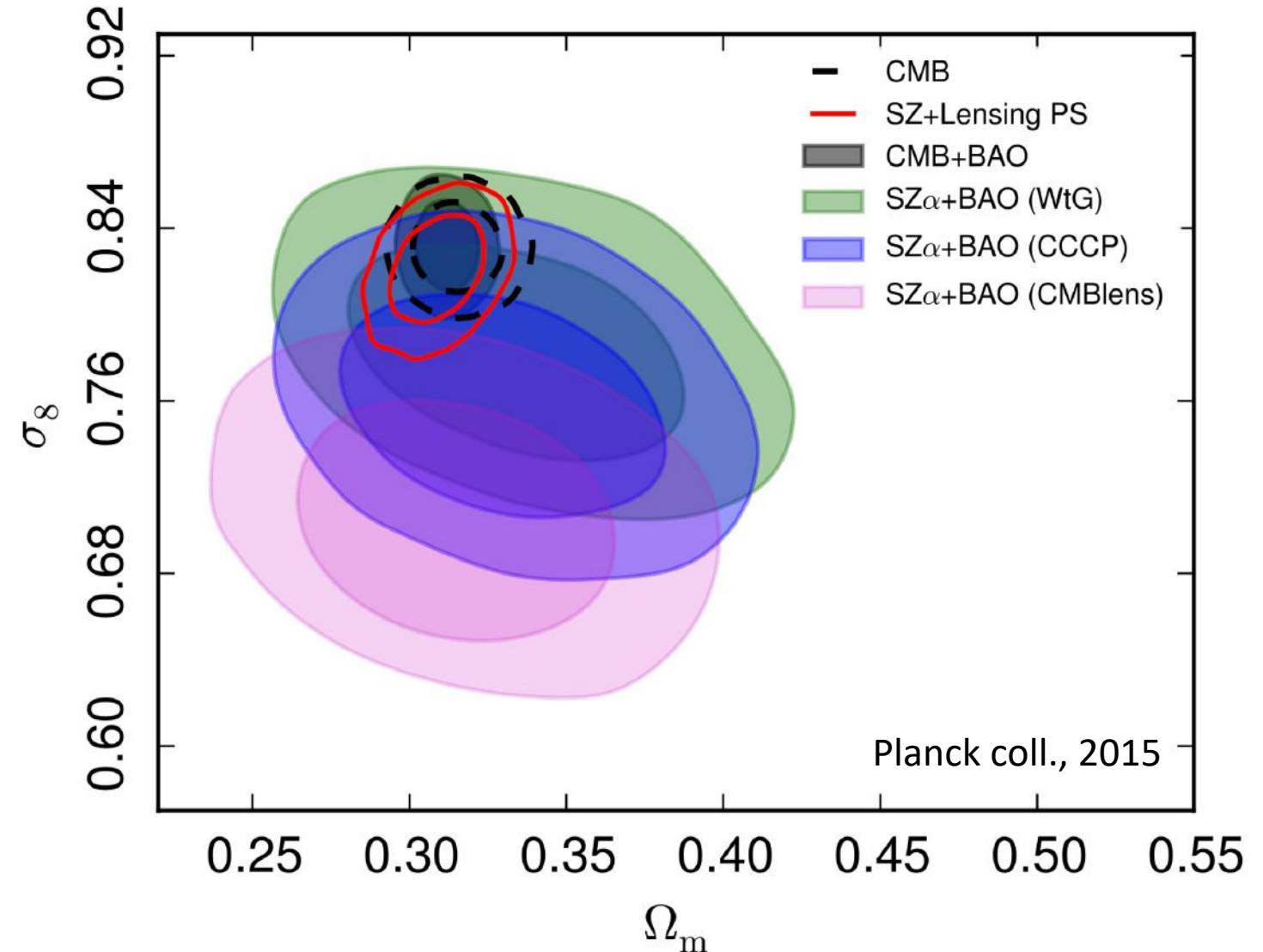


Before (re)combination, the photons are scattered by free electrons. After, they travel freely.

# Cosmology with clusters

Mass function:  
 $z, M \longleftrightarrow \text{cosmo}$

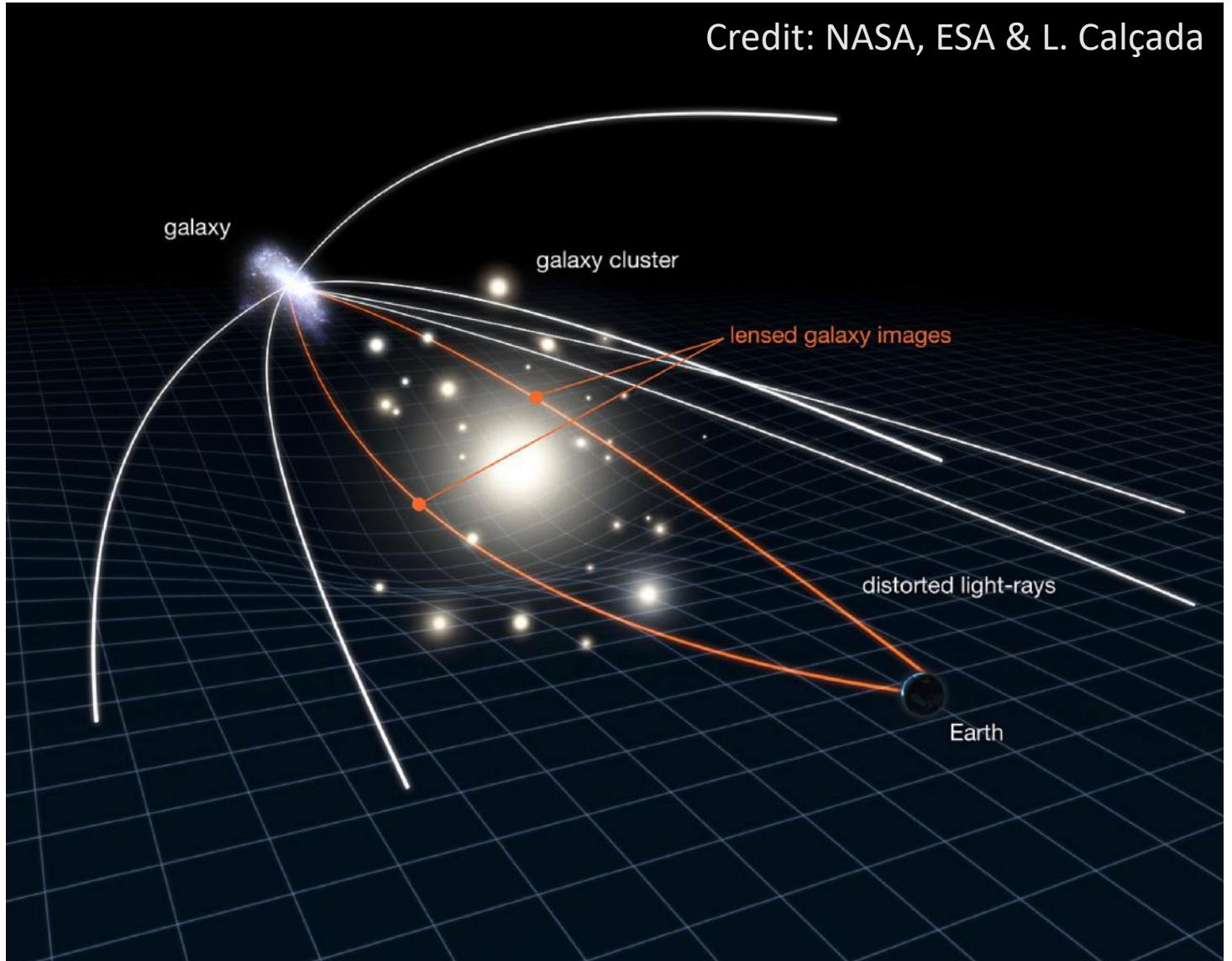
- Redshift from optical survey
- Mass from?



Constraints on  $\sigma_8$  and  $\Omega_m$  from Planck cluster count,  
based on different mass calibrations

# Gravitational lensing

- Visible light: galaxies, 3% of total mass
- X-rays: hot intracluster gas, 12% of total mass
- Gravitational lensing: the above + dark matter (85%)  
= 100% of total mass

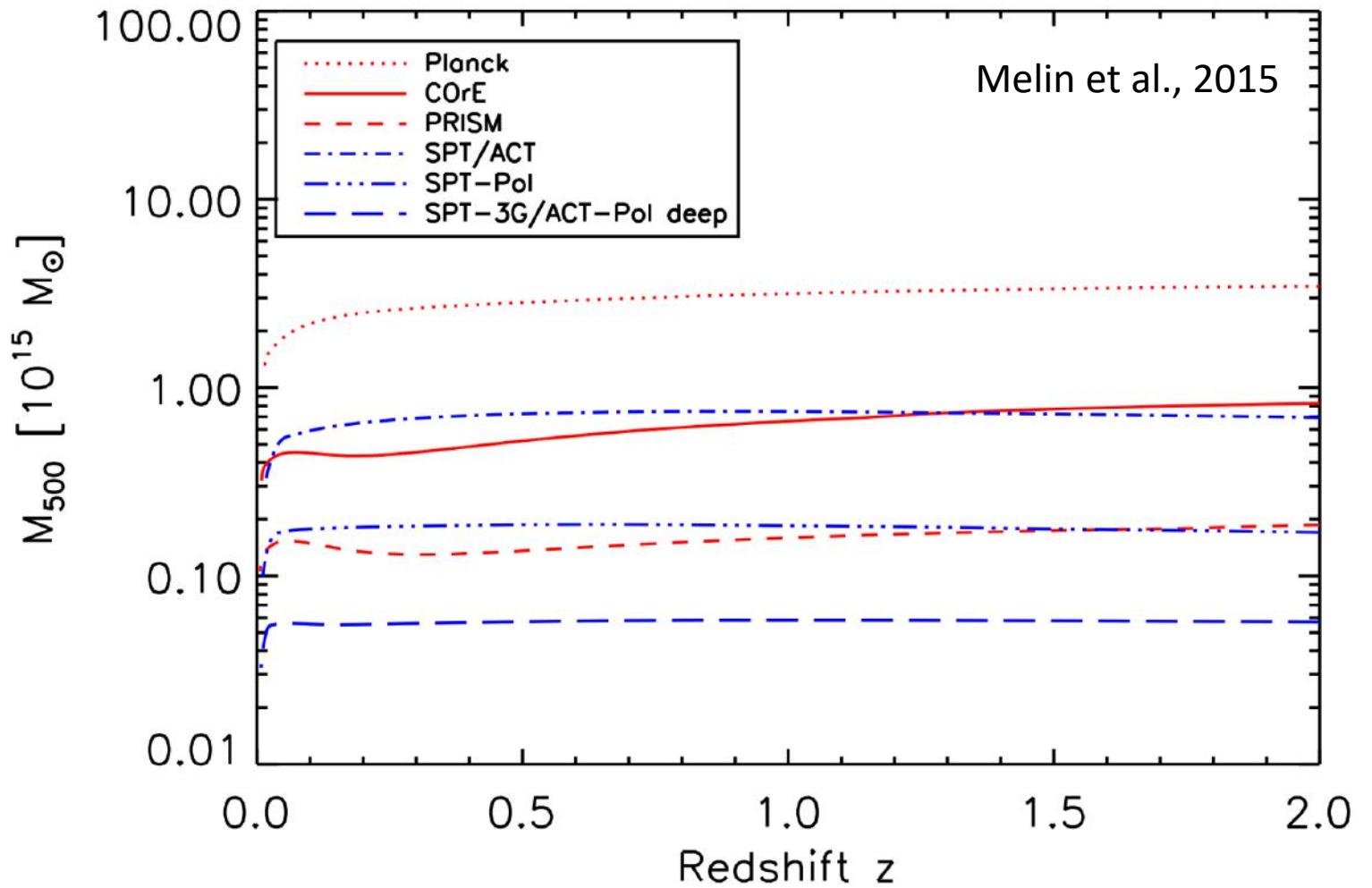


Lensing induced by a cluster on a background galaxy

# Clusters as lenses

Two different types of sources:

- Background galaxies: need to find background galaxies, i.e. up to  $z \sim 1$
- CMB: the CMB is the source, i.e. up to  $z \sim 1100$



Mass measured with a signal to noise ratio of 1 as a function of redshift for CMB lensing

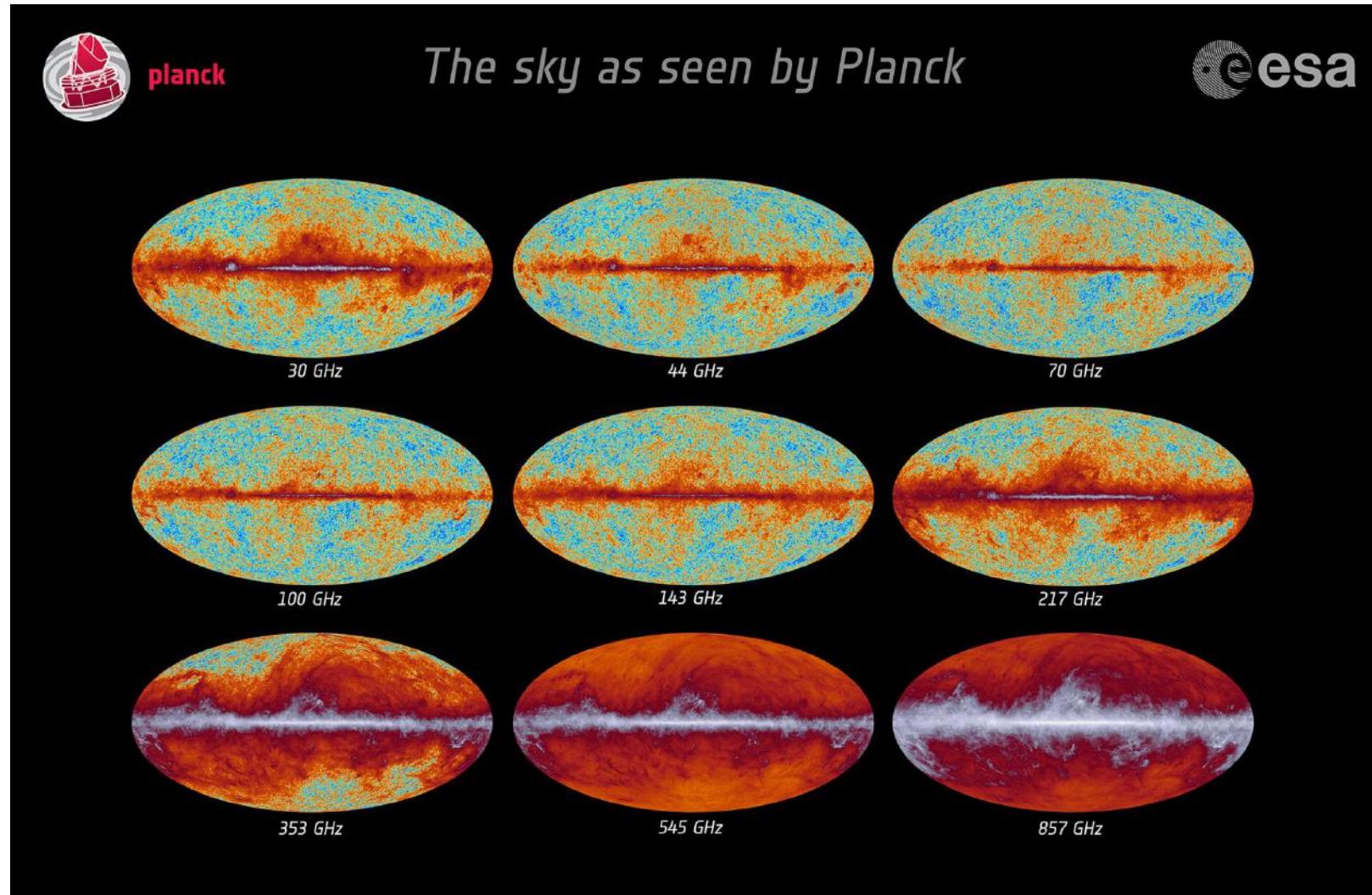
# What to do then?

- We use Planck et SPT-SZ, two complementary data sets
- First steps: one analysis for each data set
  - Analysis on simulated maps
  - Apply the method to real data
- We then combine the Planck and SPT-SZ data sets
  - First simulation
  - Then real data

# Two surveys

---

- Planck survey:
  - All-sky ( $42000 \text{ deg}^2$ )
  - 5 arcmin beam
  - 6 frequencies used
  - In space
- SPT-SZ survey:
  - $2500 \text{ deg}^2$
  - 1.75 arcmin beam
  - 3 frequencies (95, 150, 220 GHz)
  - Ground based

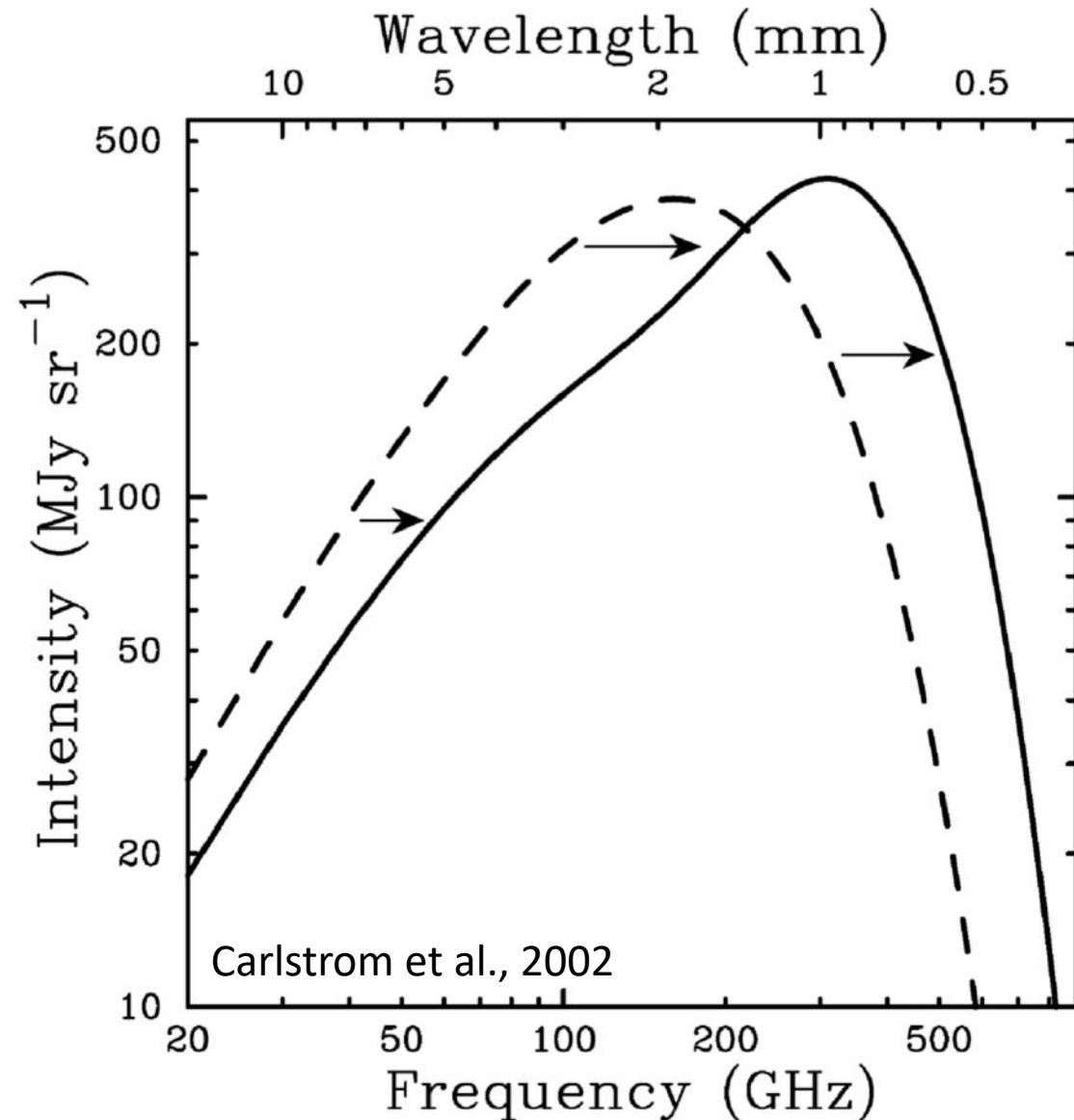


Planck maps of the sky for its 9 frequencies

# SZ effect

— Sunyaev Zel'dovich effect:

- Inverse Compton scattering of CMB photons by hot intracluster gas electrons
- The CMB blackbody spectrum is shifted
- The detection of this shift is a hint to the presence of a cluster

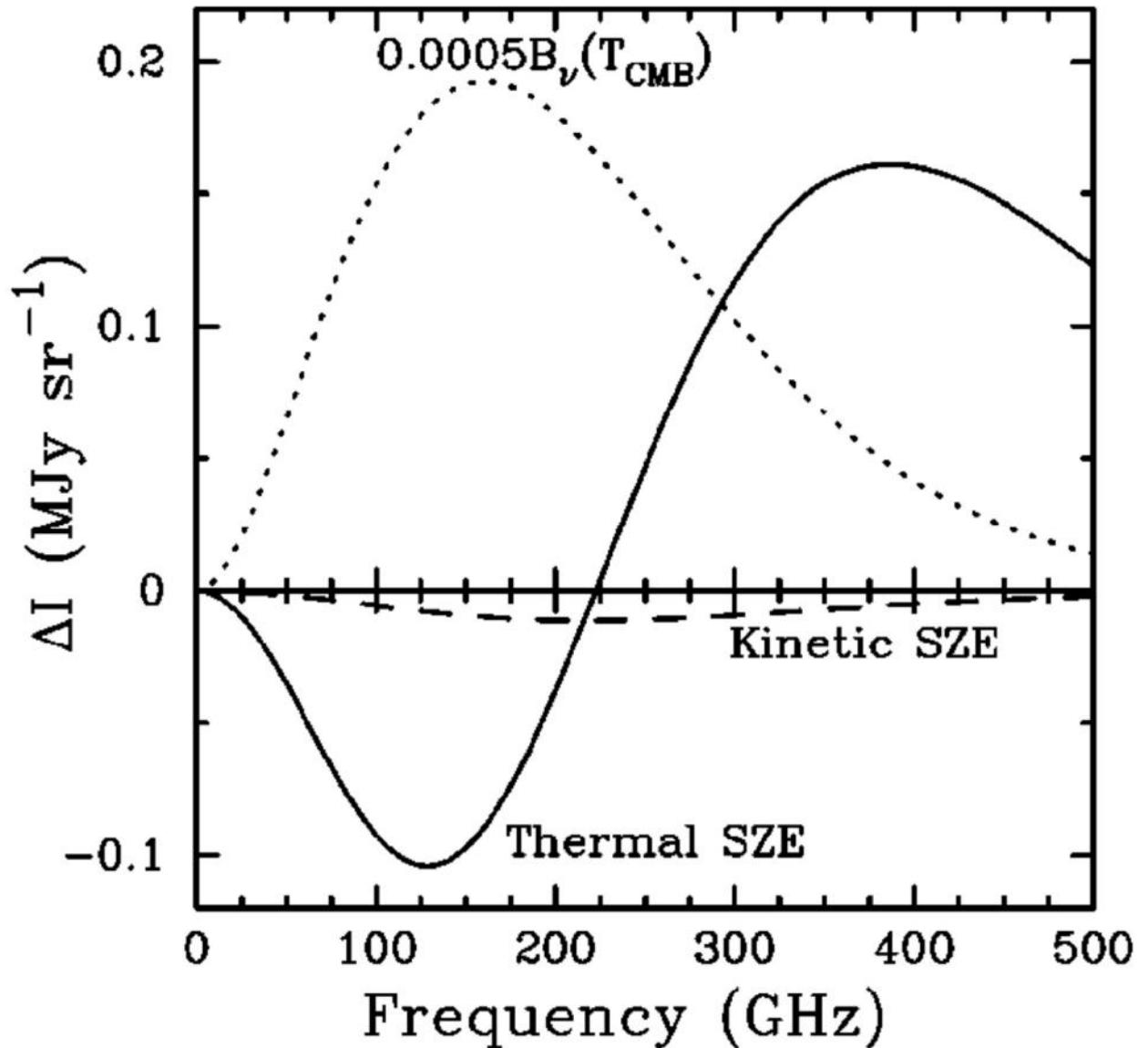


Intensity of the CMB with respect to frequency before and after the scattering

# Map simulation

- CMB: built from Planck CMB power spectrum
- Cluster lens: Navarro-Frenk-White (NFW) density profile
- SZ effect: generalized NFW (GNFW) profile
- Instrumental point spread function (PSF)
- Instrumental noise

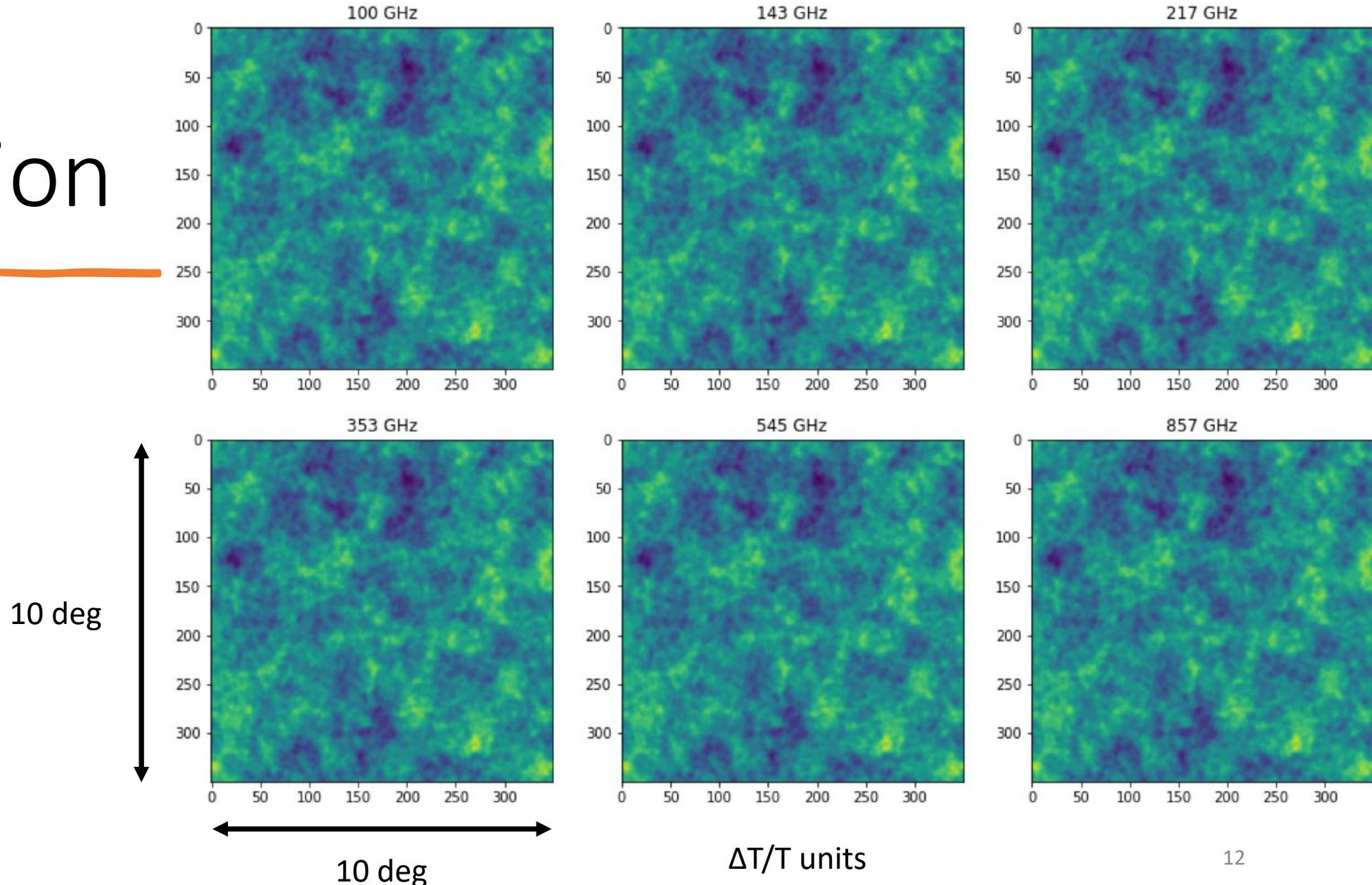
Carlstrom et al., 2002



Sunyaev-Zel'dovich intensity shift with  
respect to frequency

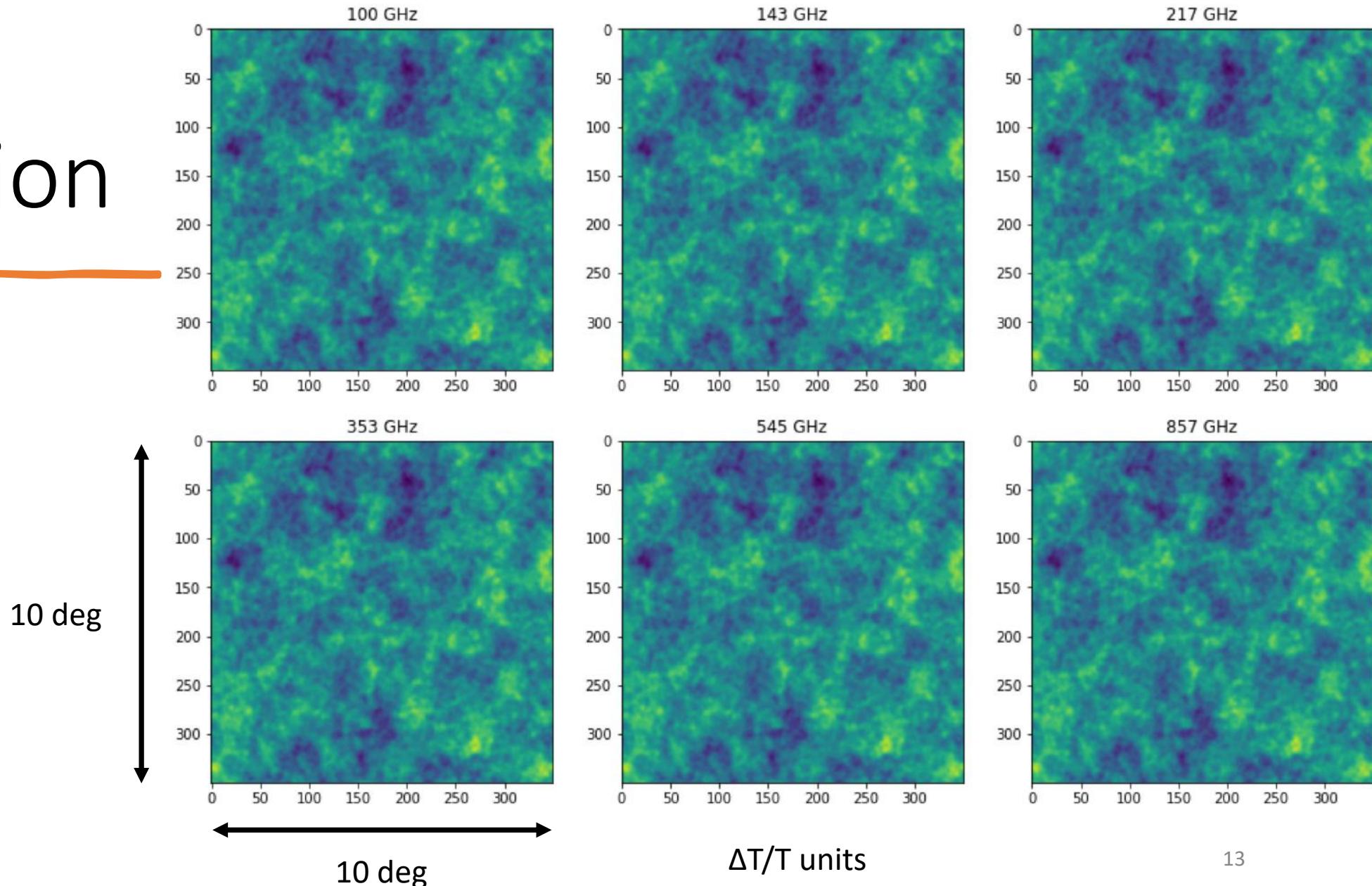
# Planck simulation

- CMB



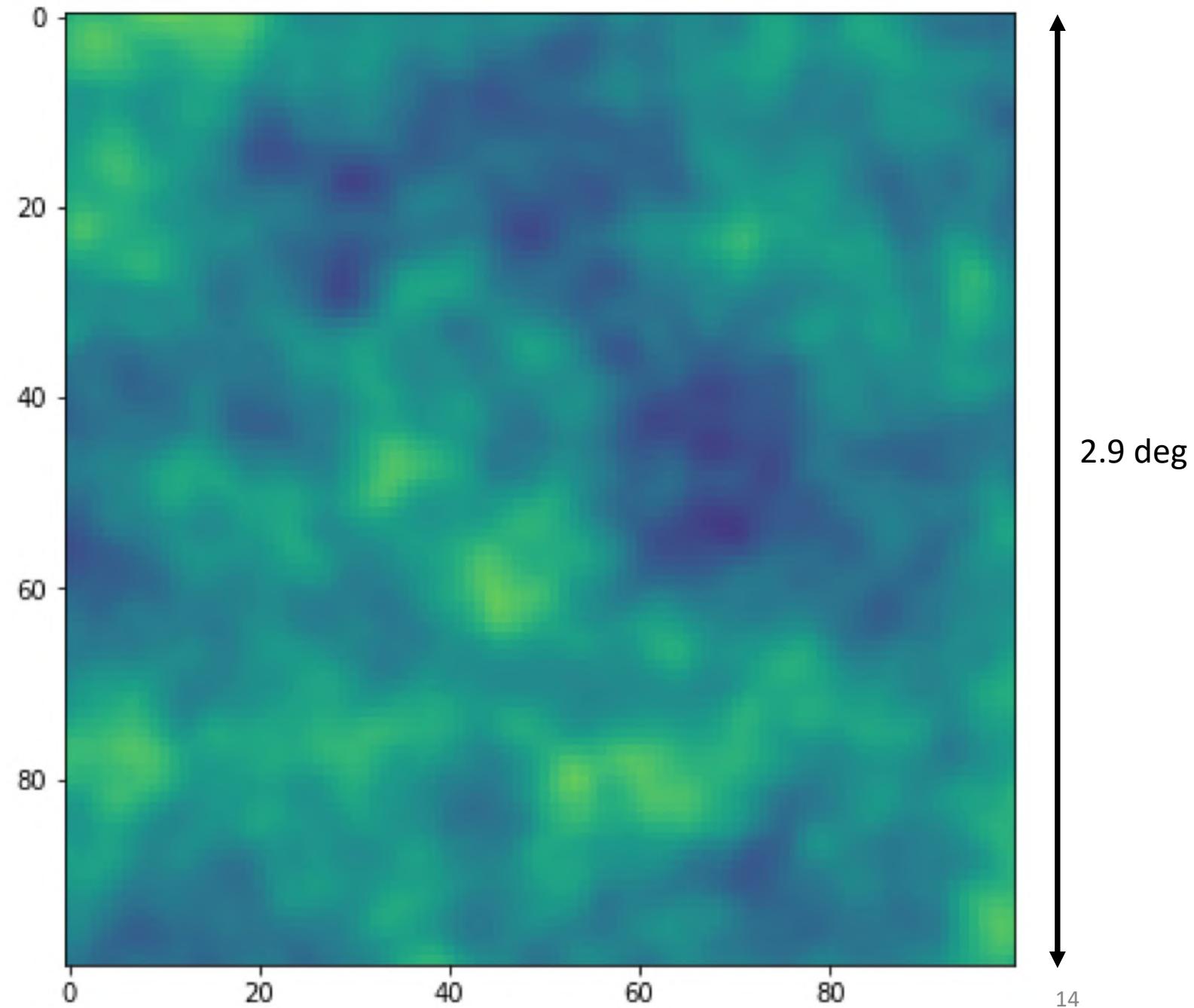
# Planck simulation

- CMB
- Cluster lens



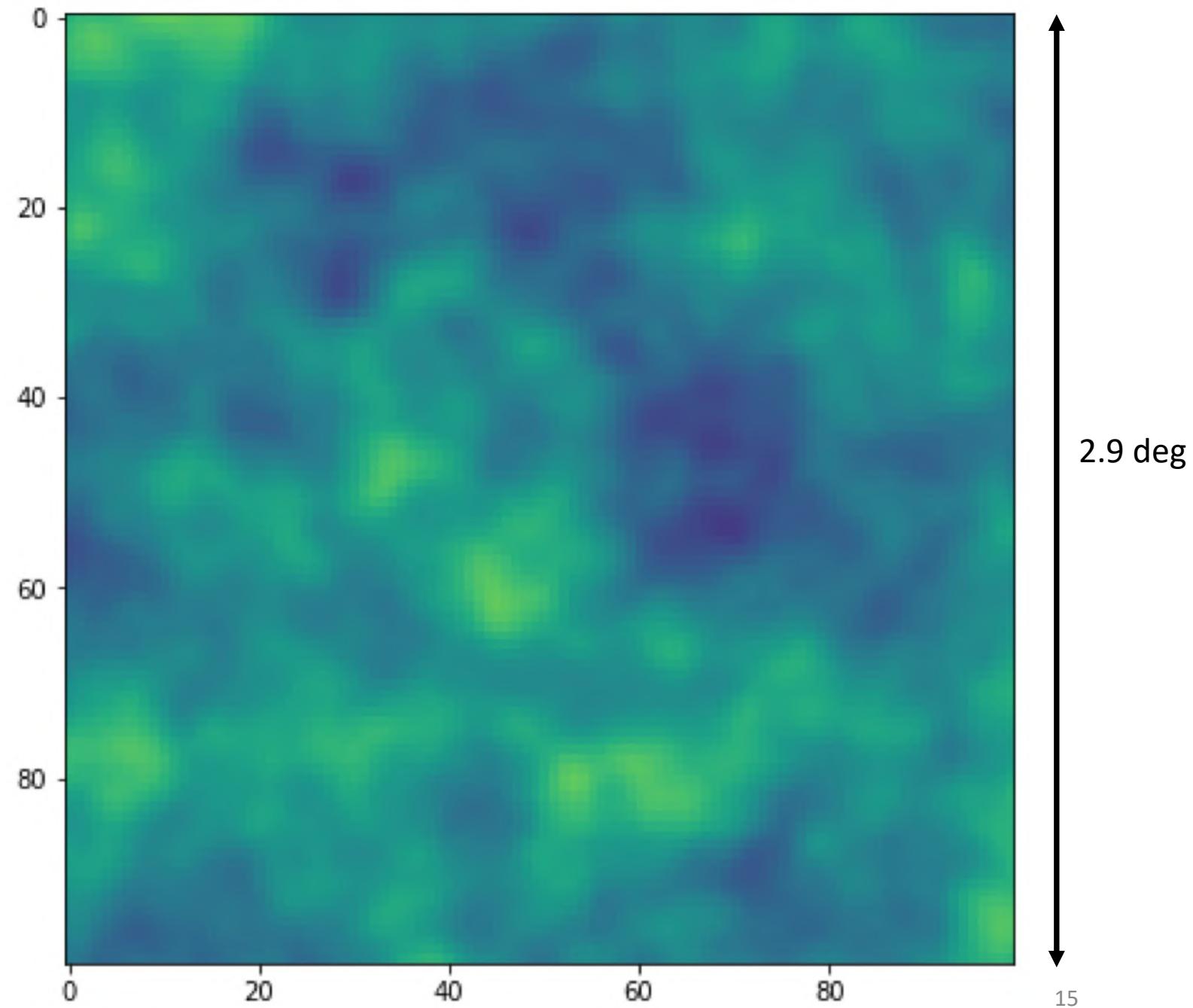
# Planck simulation

- CMB



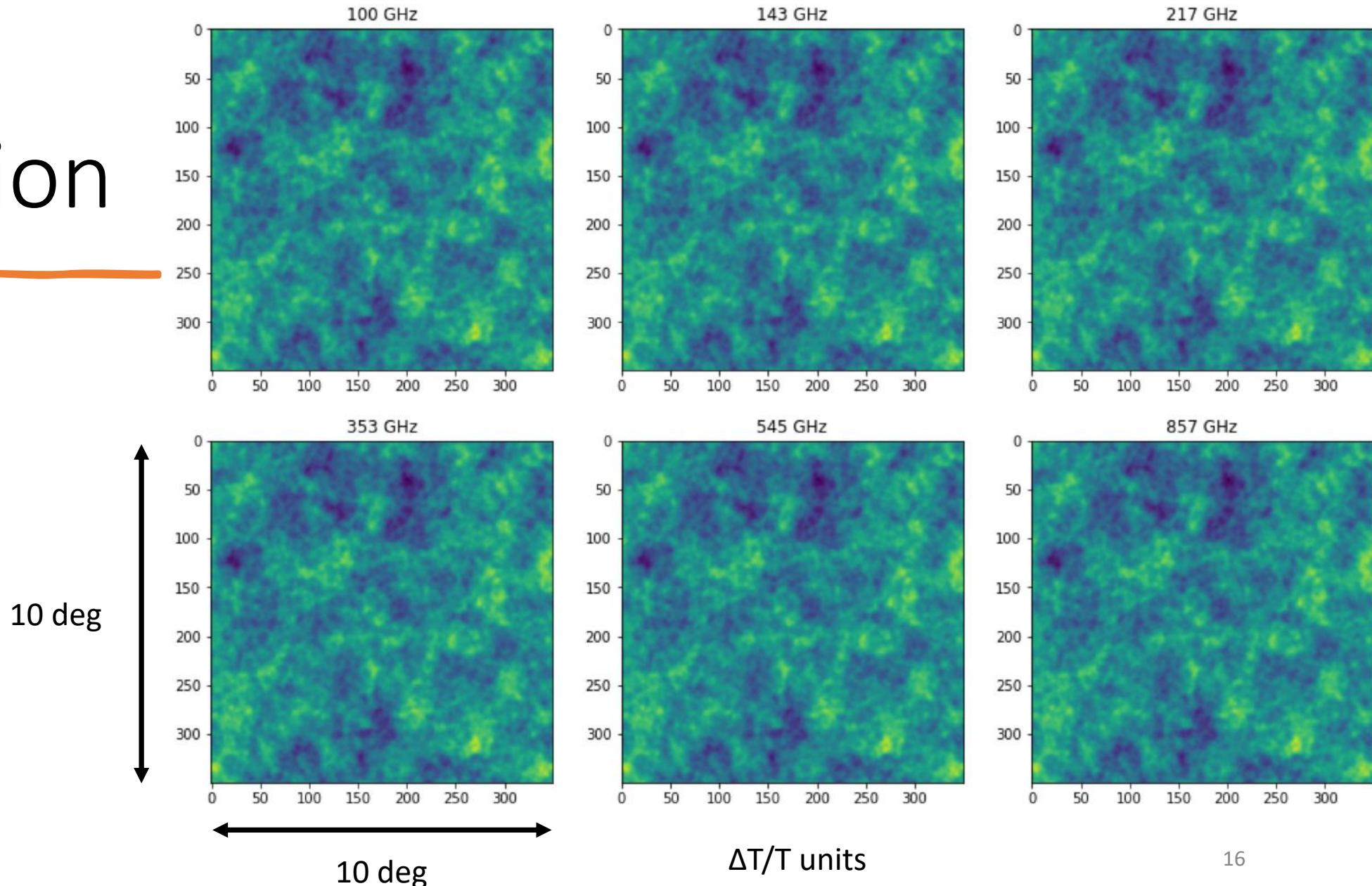
# Planck simulation

- CMB
- Cluster lens



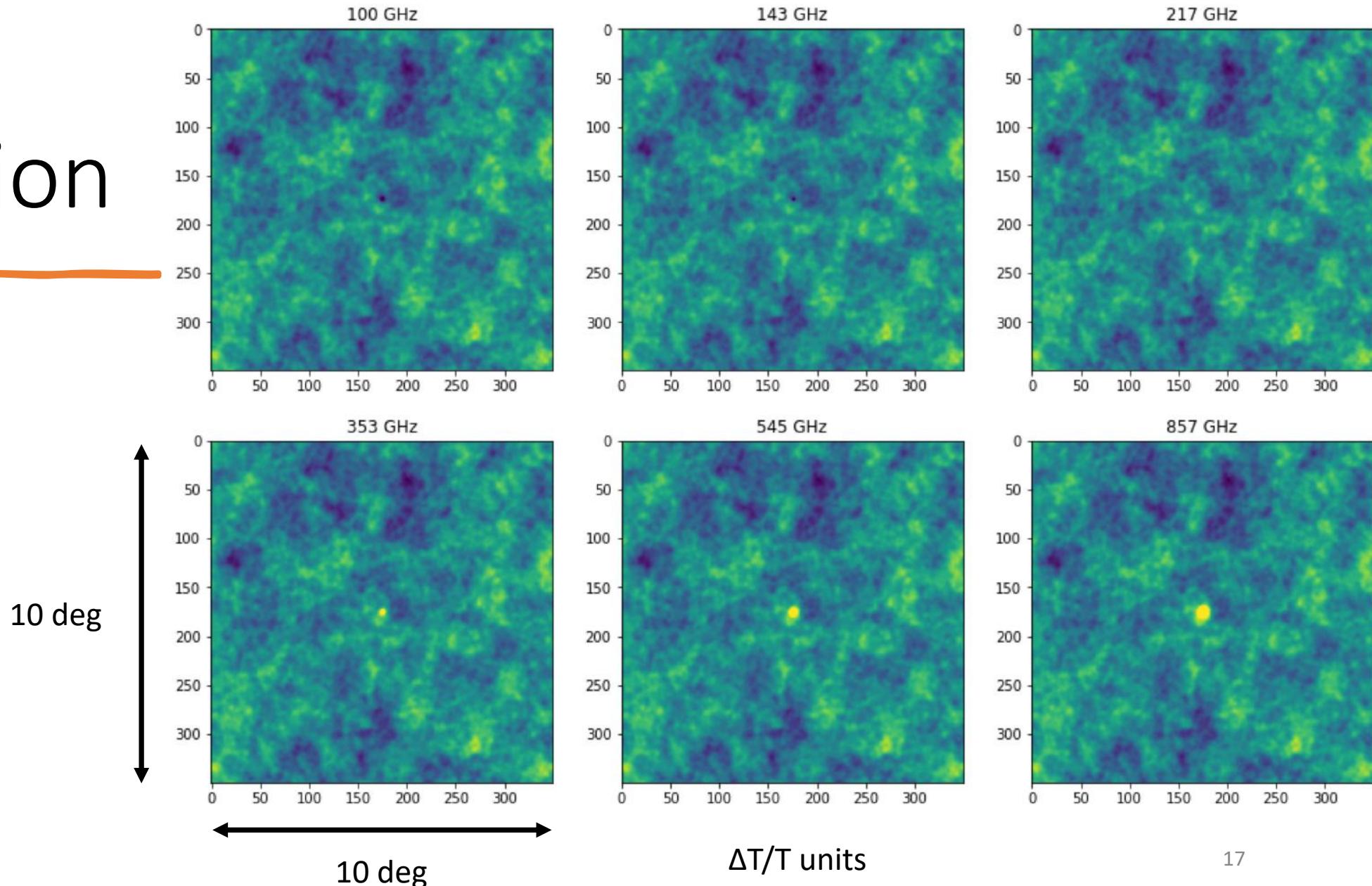
# Planck simulation

- CMB
- Cluster lens



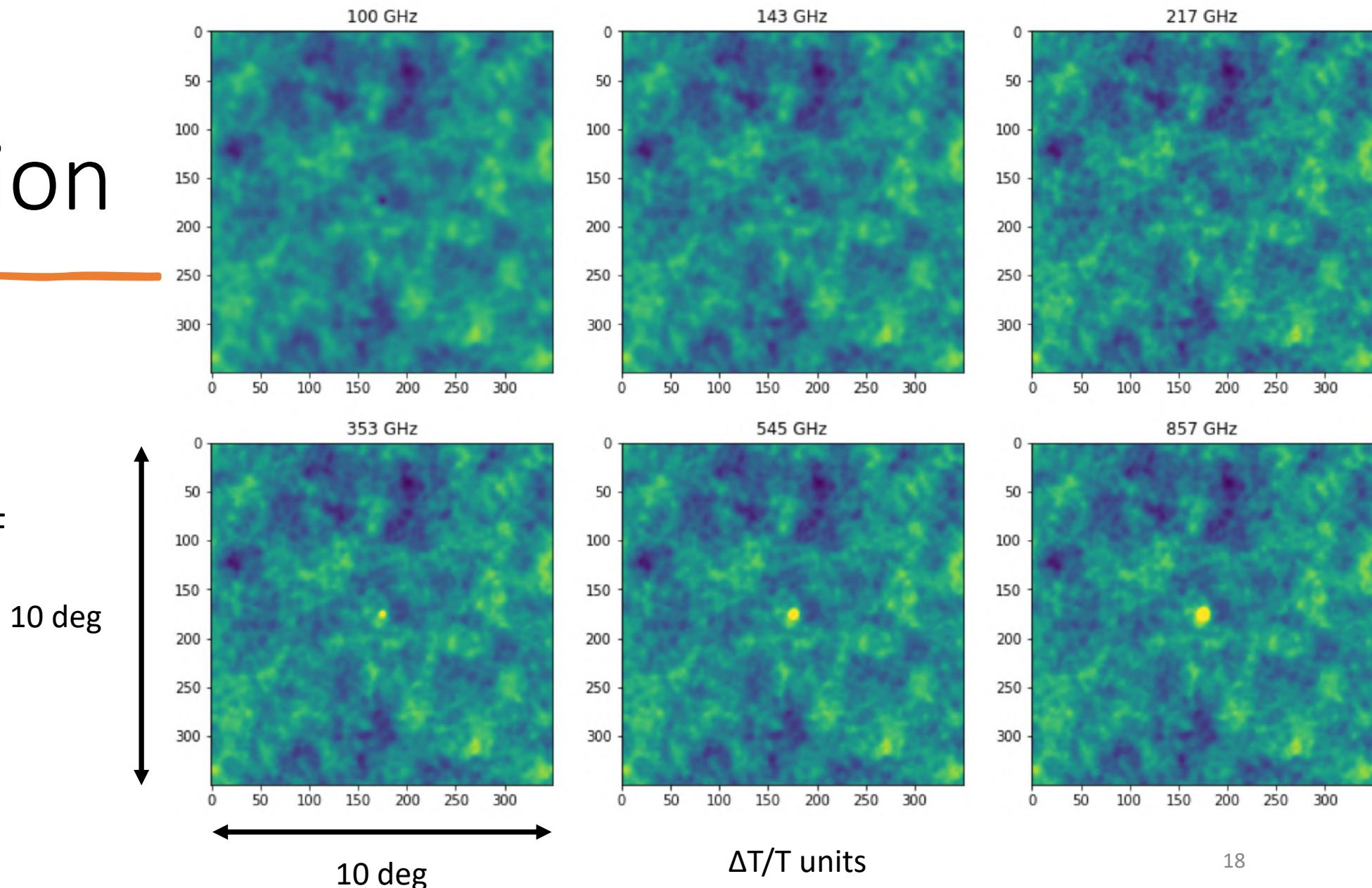
# Planck simulation

- CMB
- Cluster lens
- SZ effect



# Planck simulation

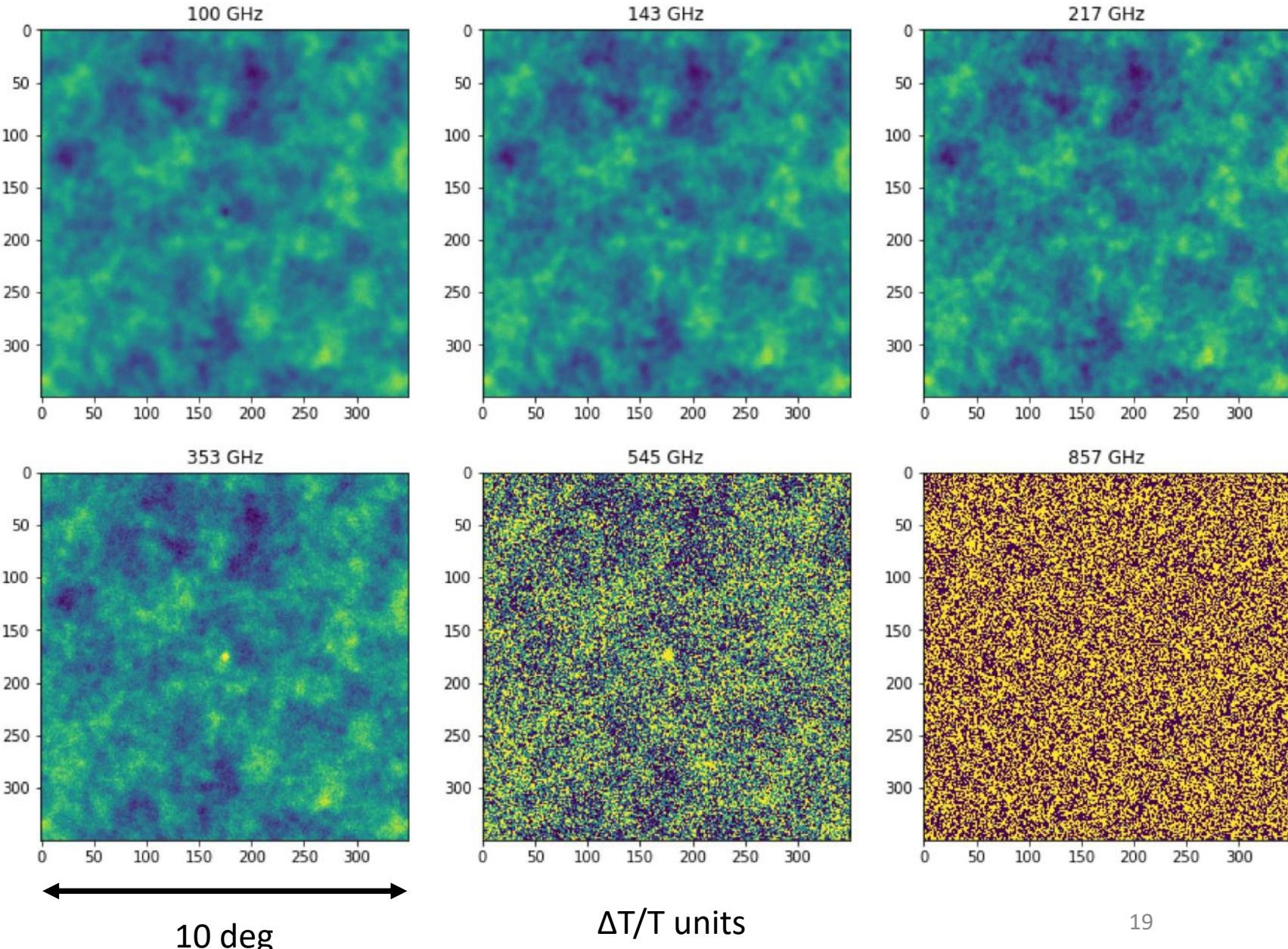
- CMB
- Cluster lens
- SZ effect
- Instrumental PSF



# Planck simulation

- CMB
- Cluster lens
- SZ effect
- Instrumental PSF
- Instrumental noise

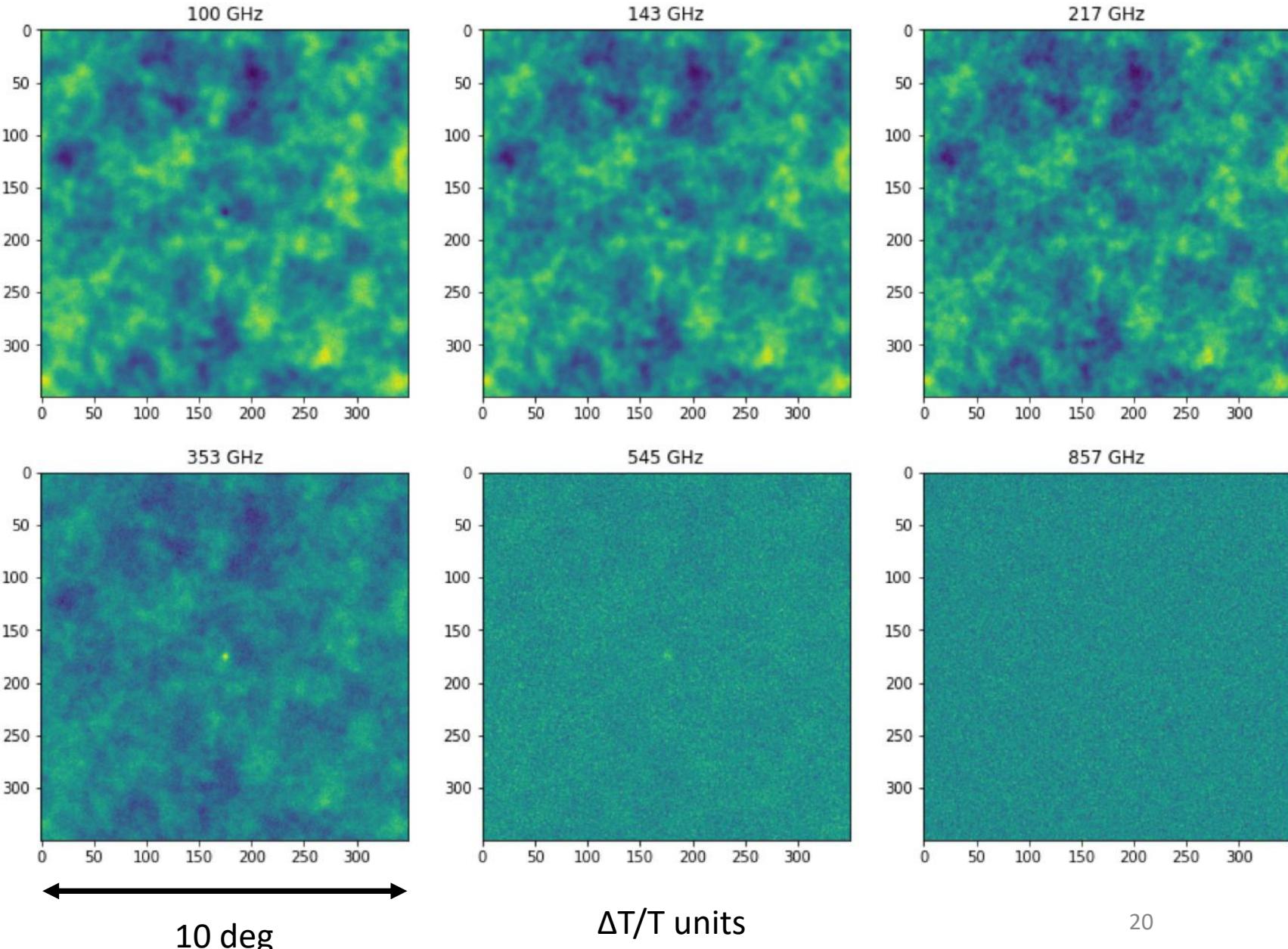
10 deg



# Planck simulation

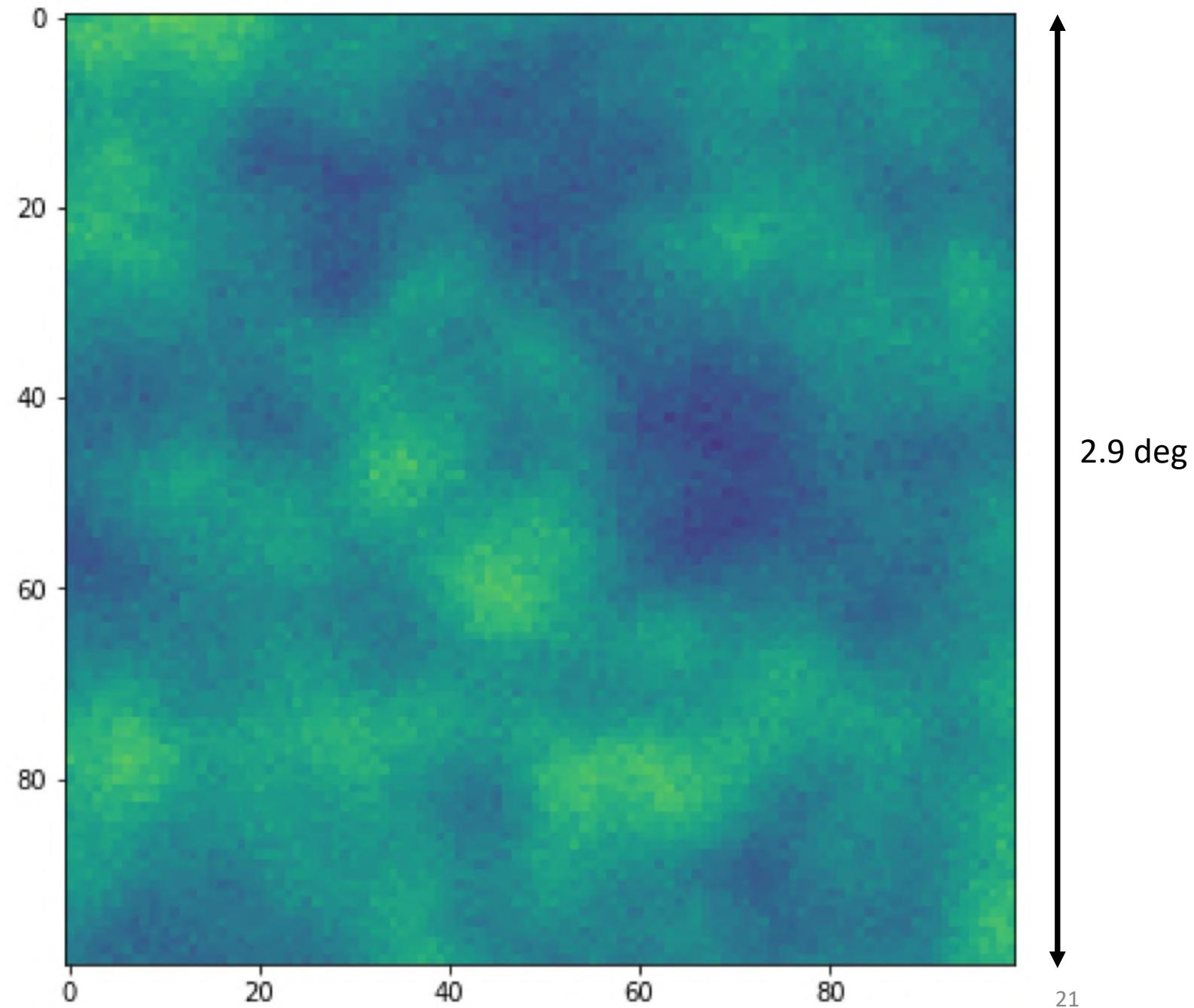
- CMB
- Cluster lens
- SZ effect
- Instrumental PSF
- Instrumental noise

10 deg



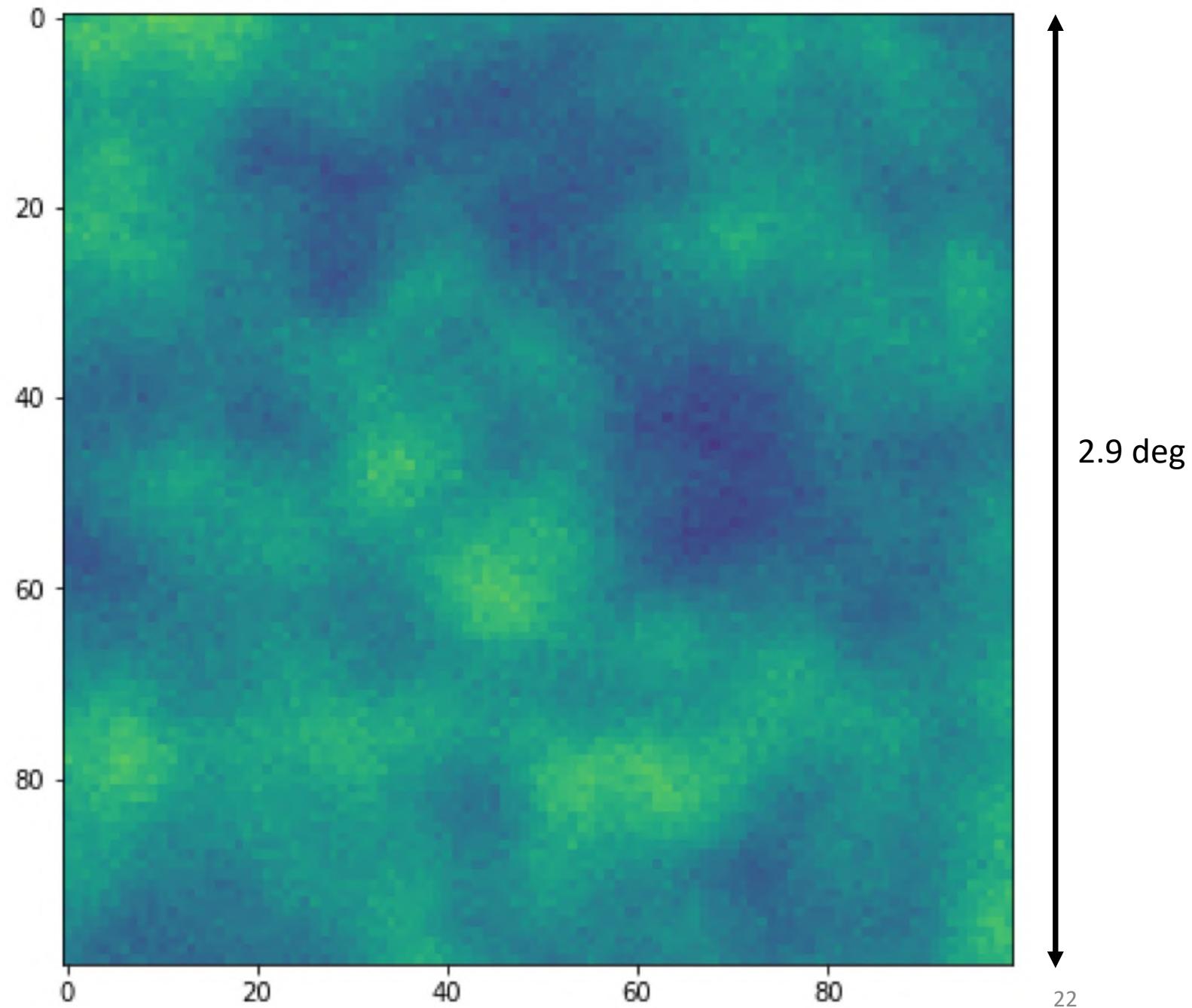
# Planck simulation

- 100 GHz map
- No SZ
- No lens



# Planck simulation

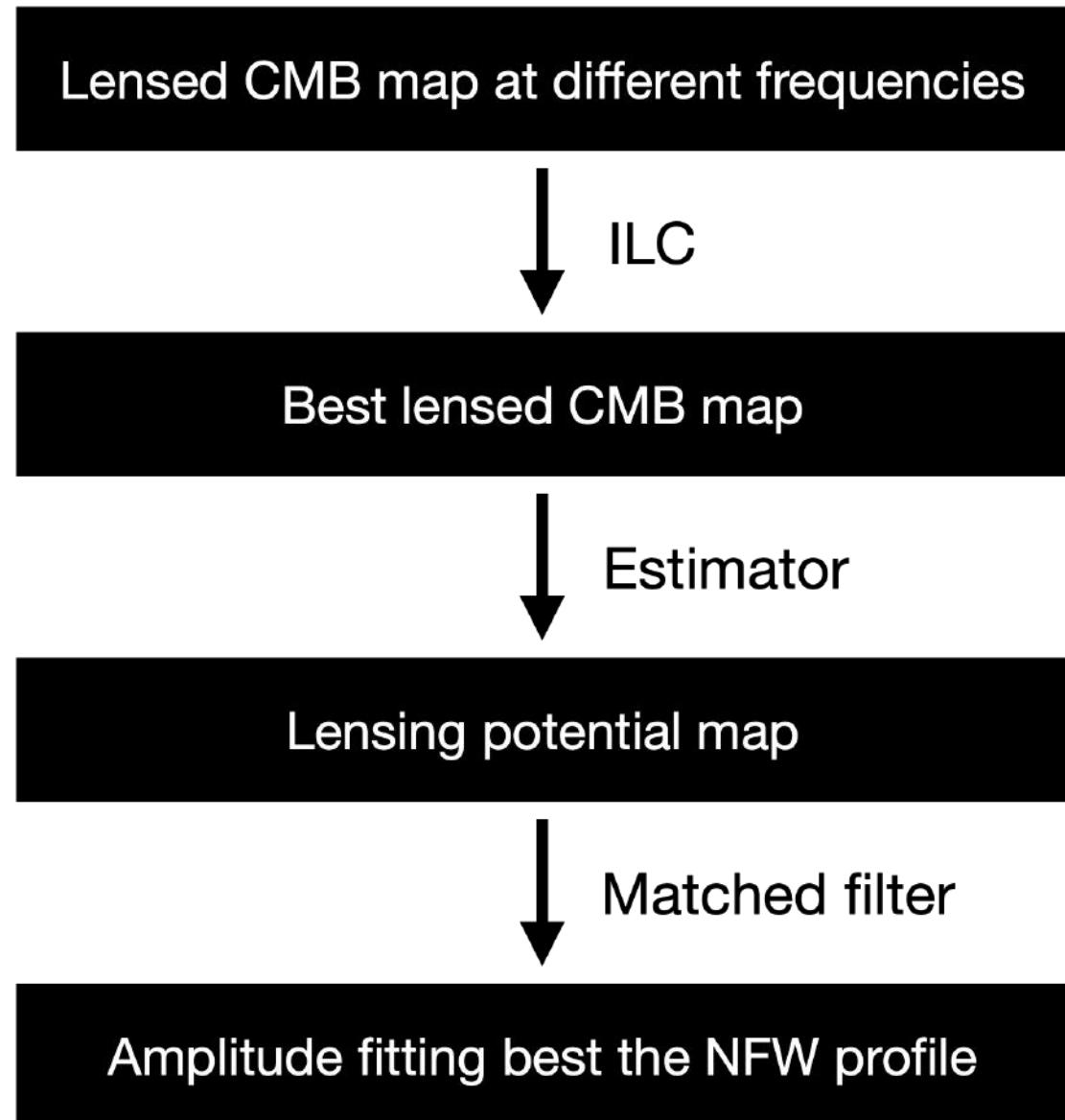
- 100 GHz map
- No SZ
- Cluster lens



# Data analysis

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- Internal Linear Combinations (ILC), Remazeilles et al., 2011
- Lensing estimator, Hu & Okamoto, 2002
- Matched filter, Melin et al., 2015



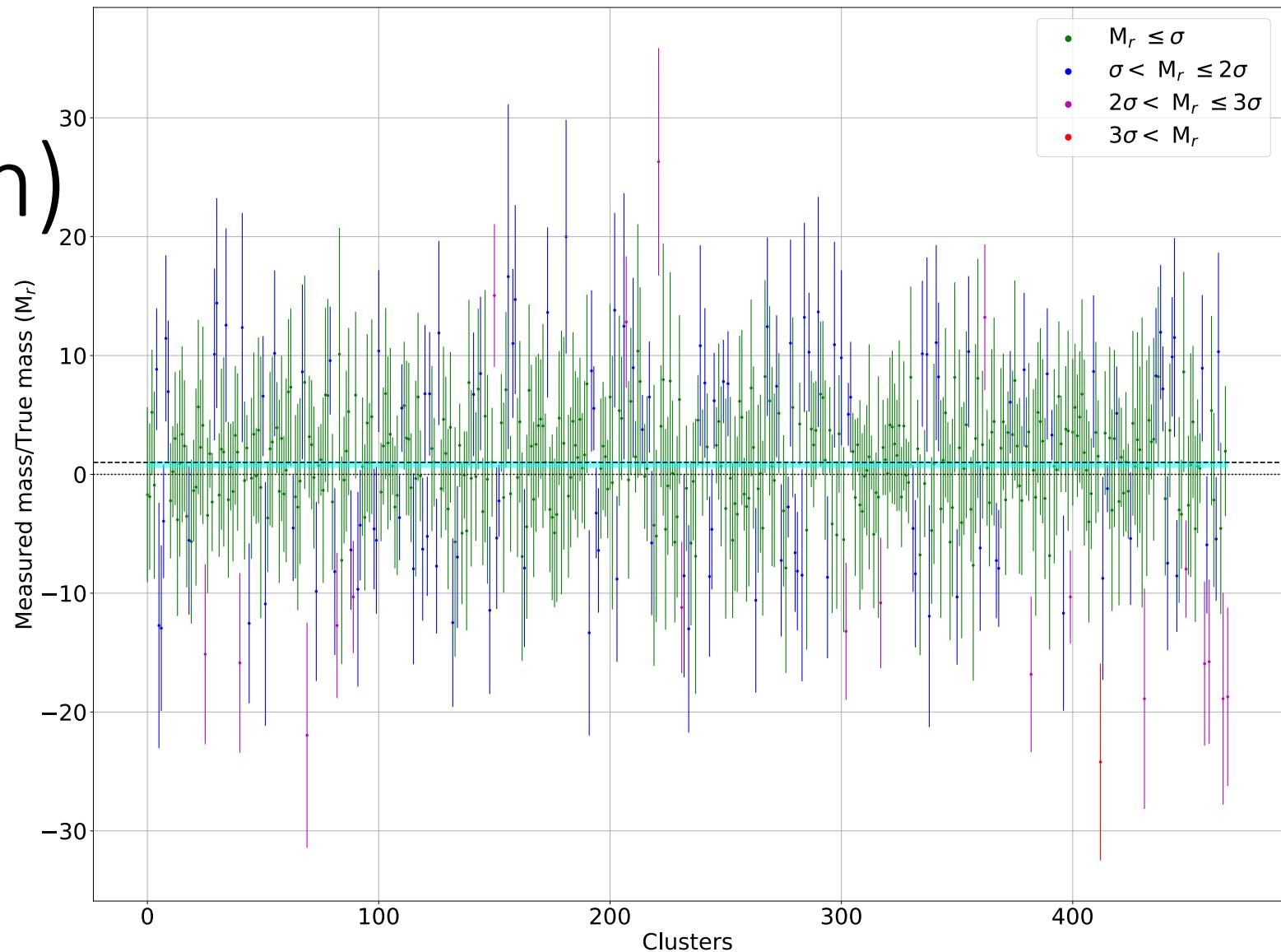
# Planck results (one realization)

Each point and associated error bar correspond to an individual cluster mass measurement, for a total of 468.

Averaging these measurements provides

$$\langle M_r \rangle = 0.84 \pm 0.25,$$

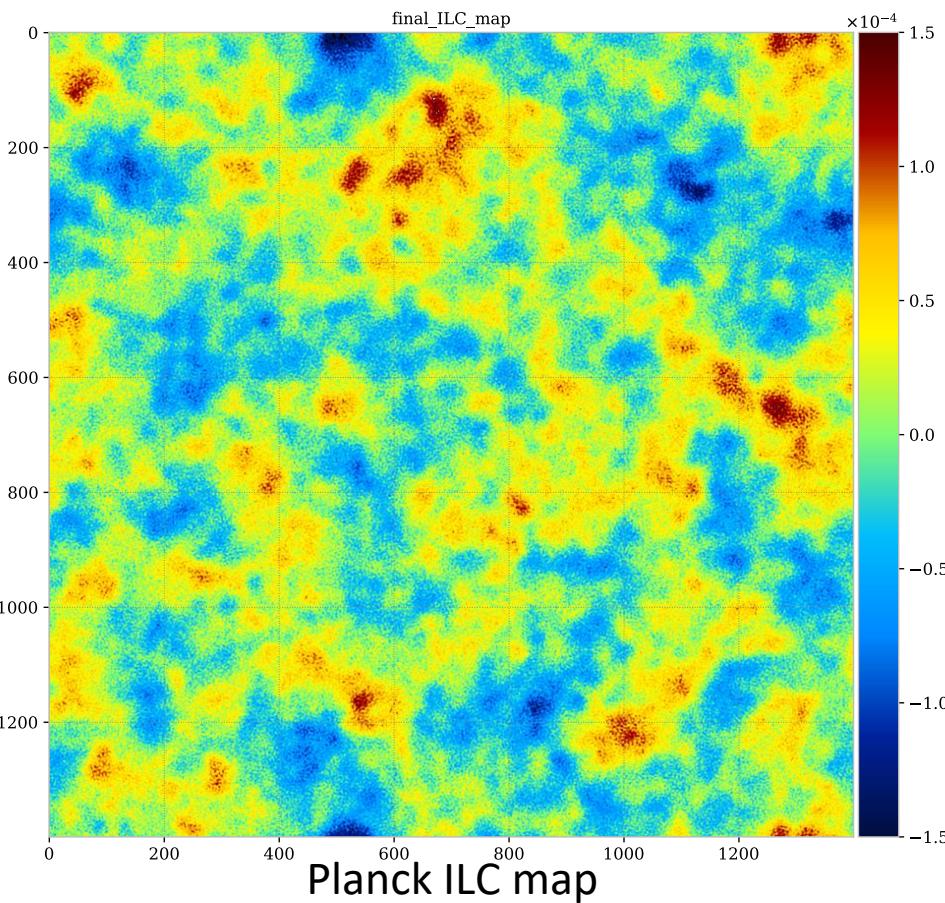
compatible with one



# Comparison between Planck and SPT results...

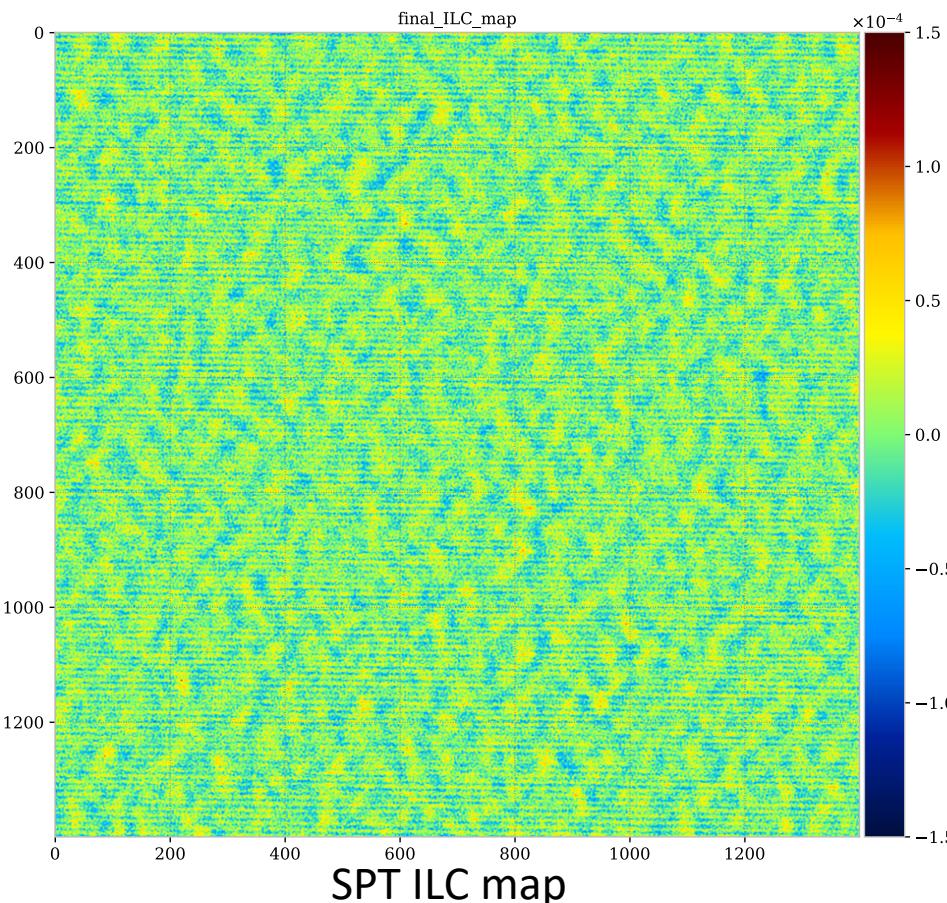
**Planck ILC maps: large scales**

$\langle M_r \rangle = 0.84 \pm 0.25$  (one realization)



**SPT ILC maps: small scales**

$\langle M_r \rangle = 0.91 \pm 0.22$  (one realization)

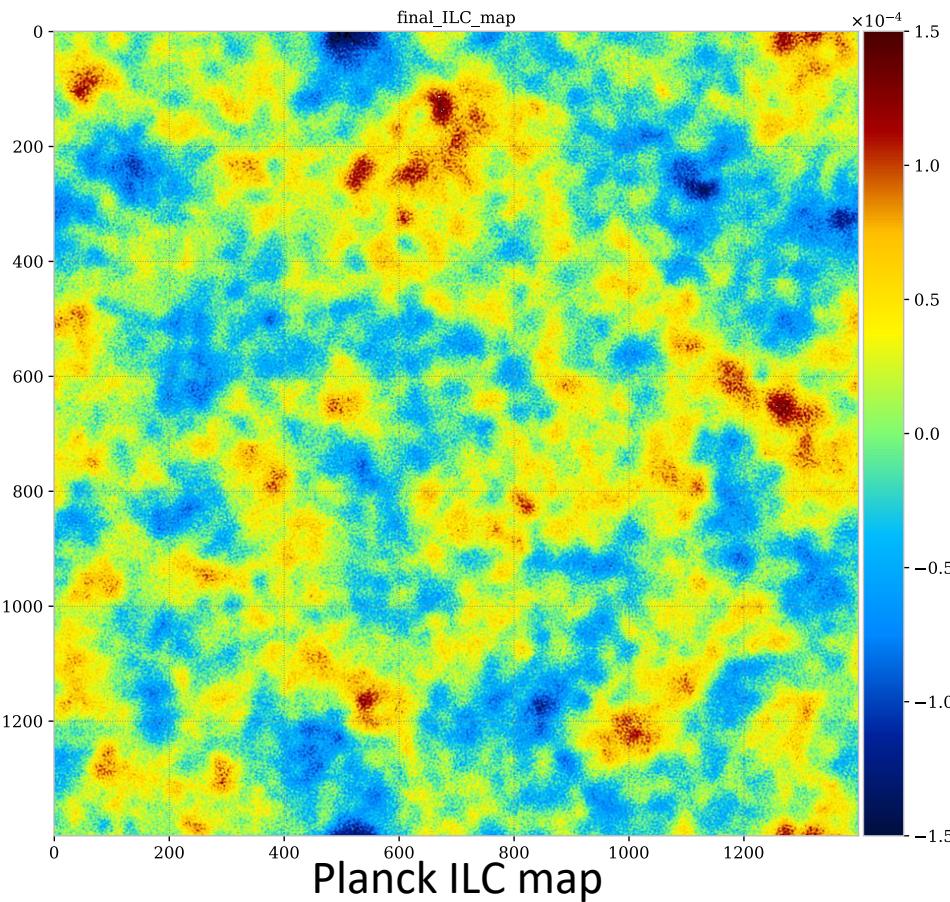


Final ILC maps for  
the same location

# ... and the combination of both

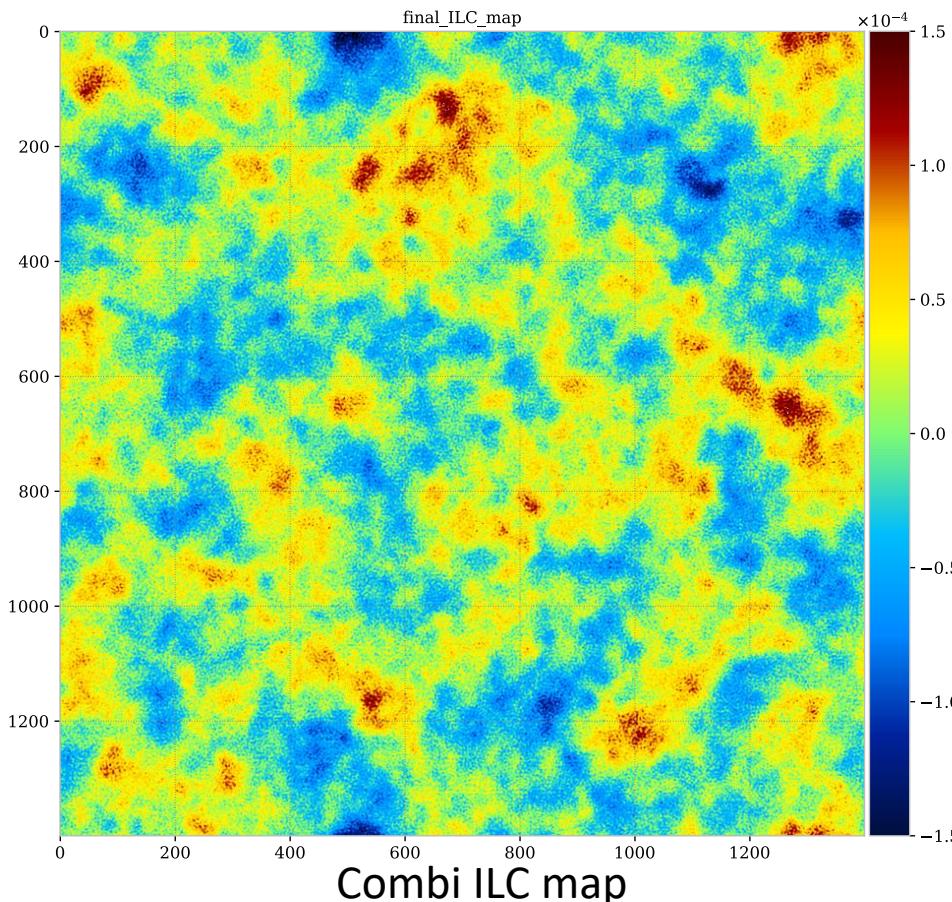
**Planck:**  $\langle M_r \rangle = 0.84 \pm 0.25$  (one realization)

**SPT:**  $\langle M_r \rangle = 0.91 \pm 0.22$



**Combination:**

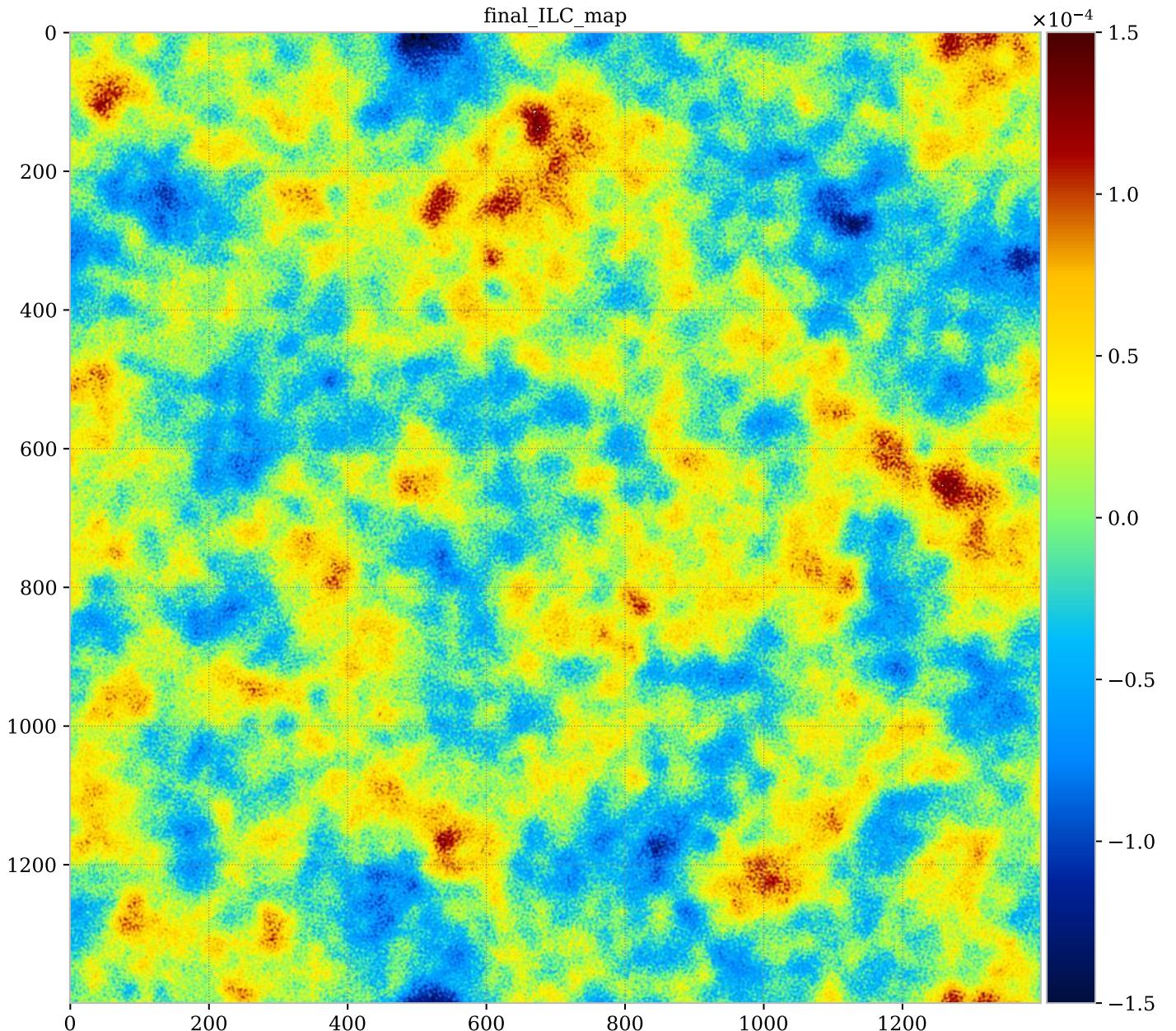
$\langle M_r \rangle = 0.88 \pm 0.17$



Final ILC maps for  
the same location

# Planck ILC map

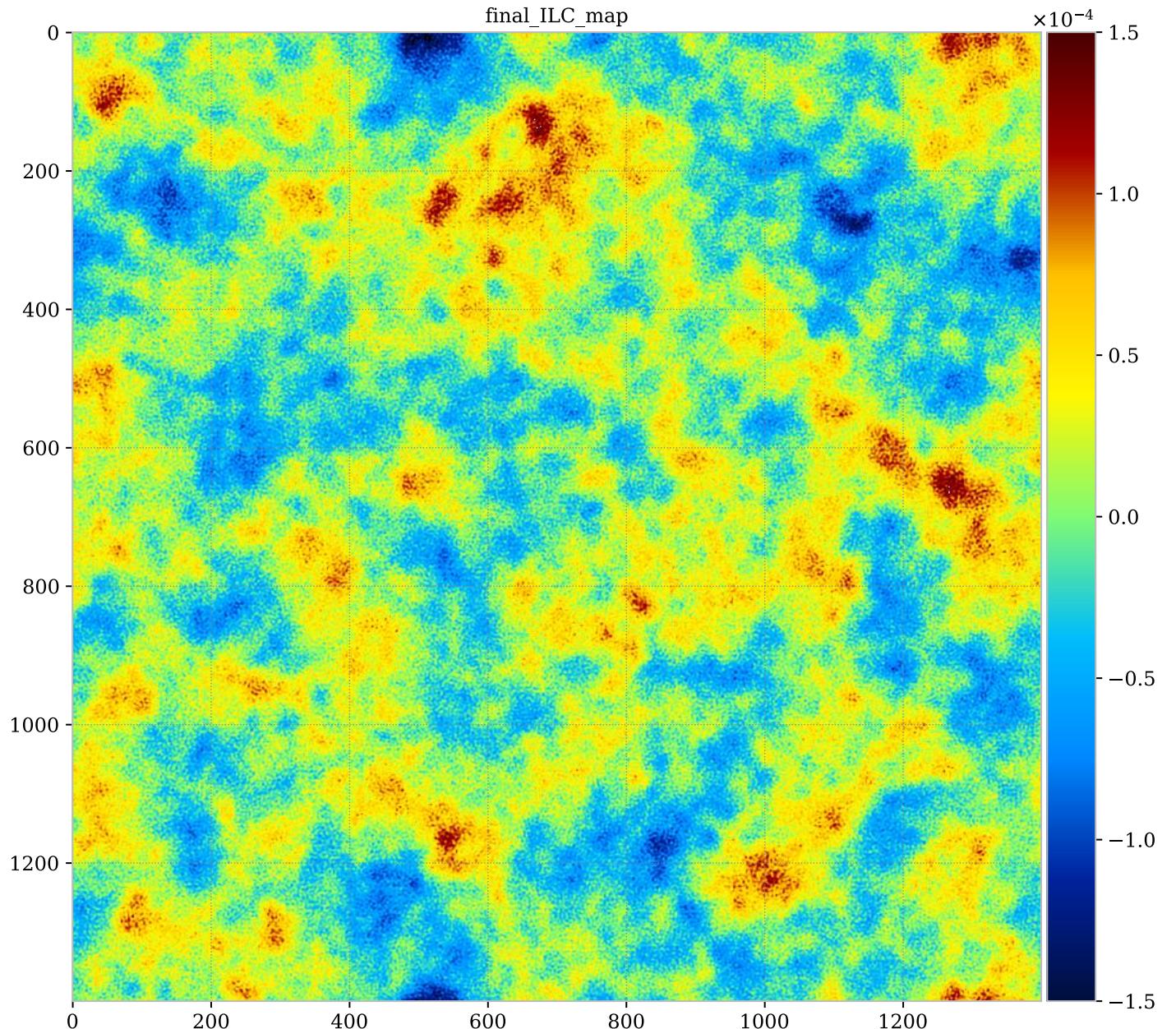
- For one simulated cluster
- No foreground simulated
- The map is periodic



# Combined ILC map

- Better small scales than Planck only
- The surveys really are complementary

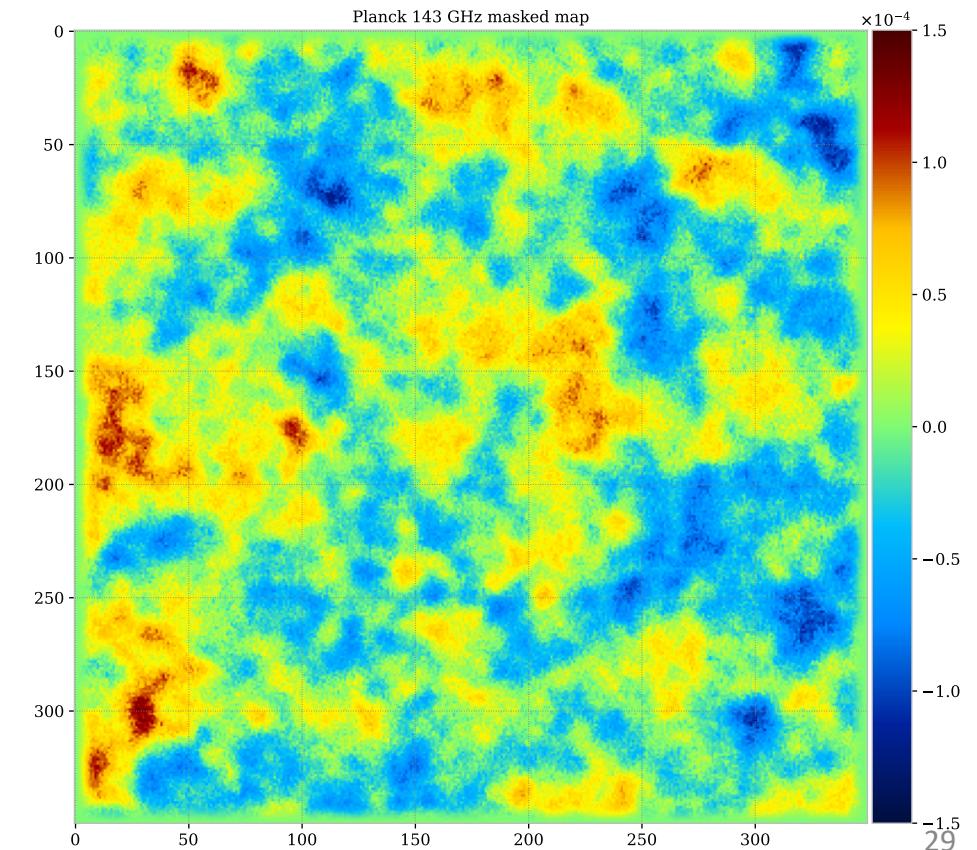
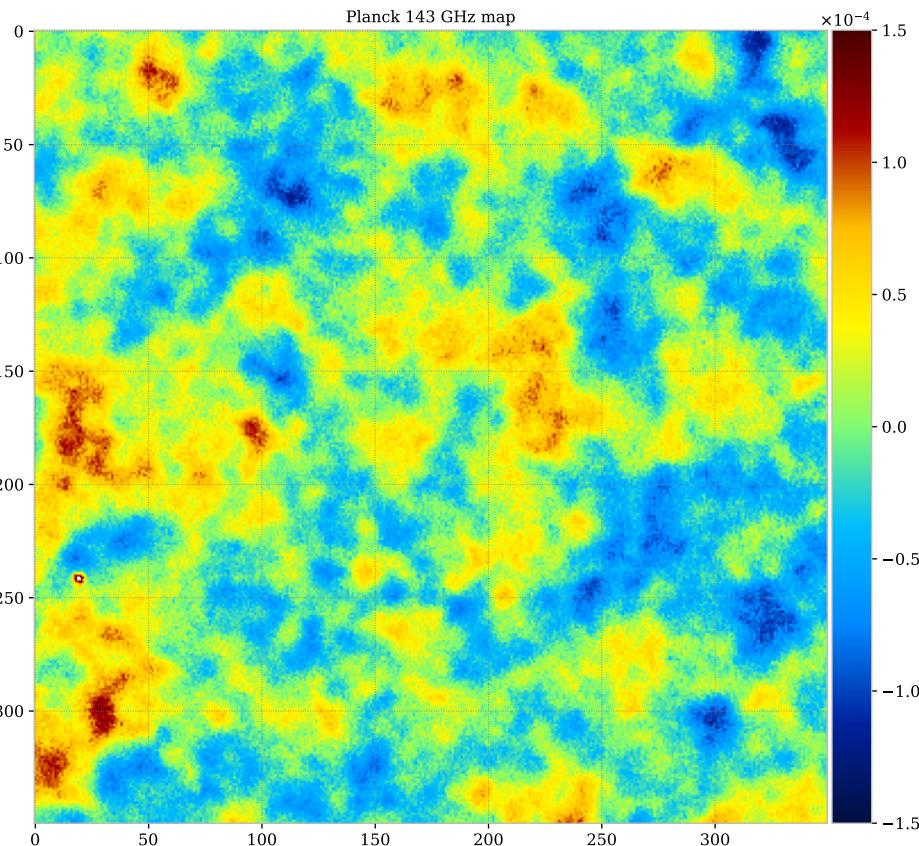
$$\frac{1}{\sigma_{combi}^2} = \frac{1}{\sigma_{planck}^2} + \frac{1}{\sigma_{SPT}^2}$$



# Real maps need to be cleaned

**Points sources:** replaced by gaussian field with CMB properties, continuity with vicinity

**Maps not periodic:** apodisation of the maps

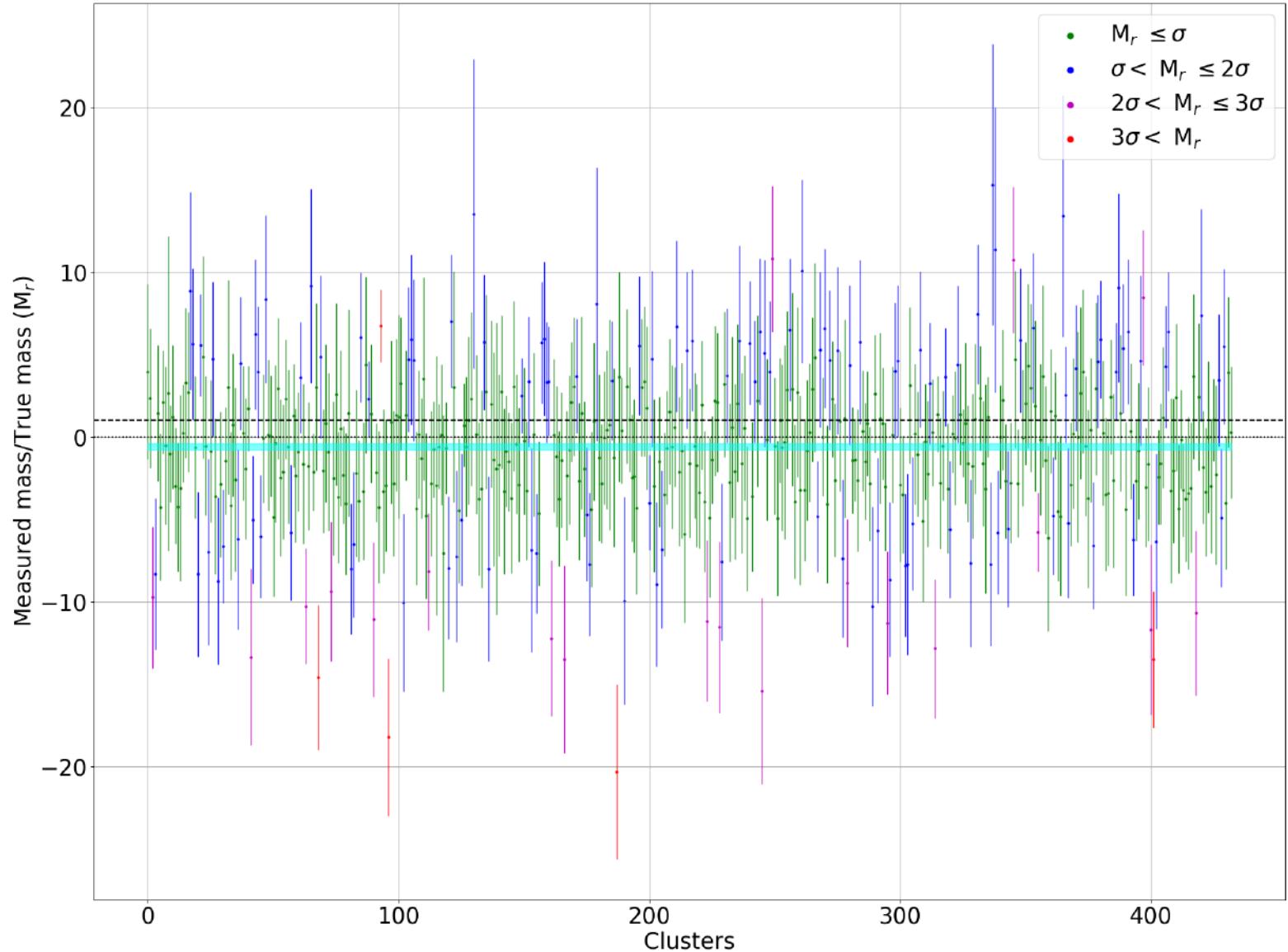


# Planck results (real maps)

- The point sources are masked
- The lensing due to foregrounds is subtracted using “off” measurements

Averaging these measurements and subtracting the offs provides

$\langle M_r \rangle = 0.97 \pm 0.28$ ,  
compatible with one



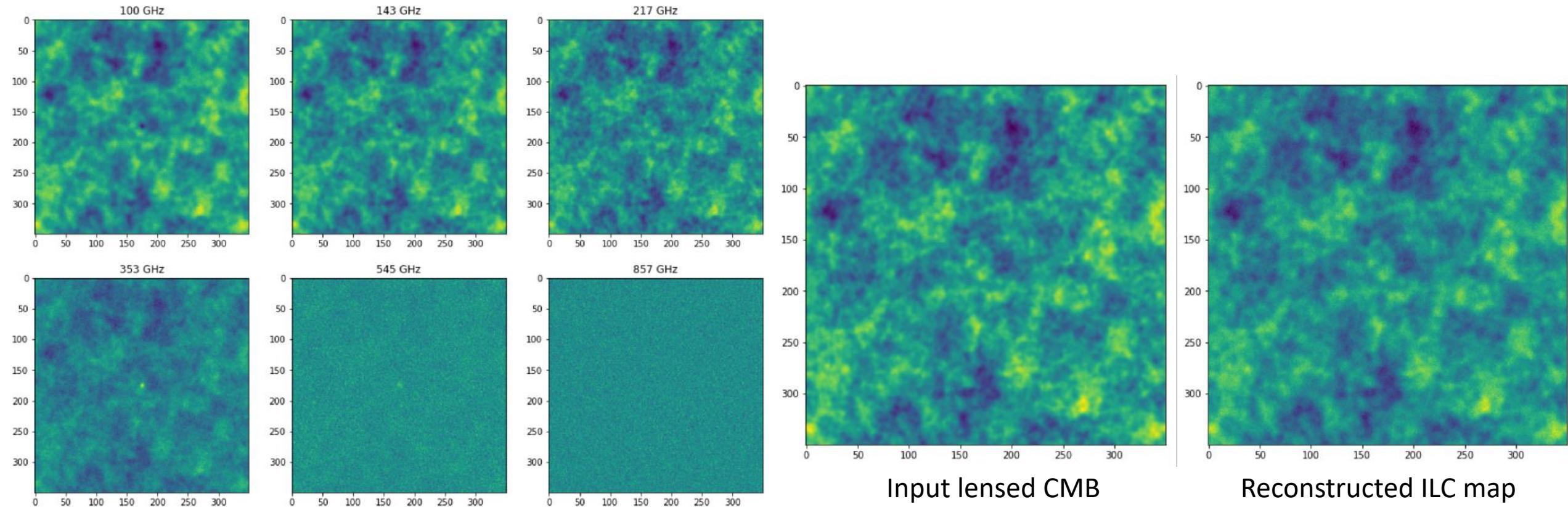
# To be continued

Thank you for your attention

# Backup slides

# Internal Linear Combinations

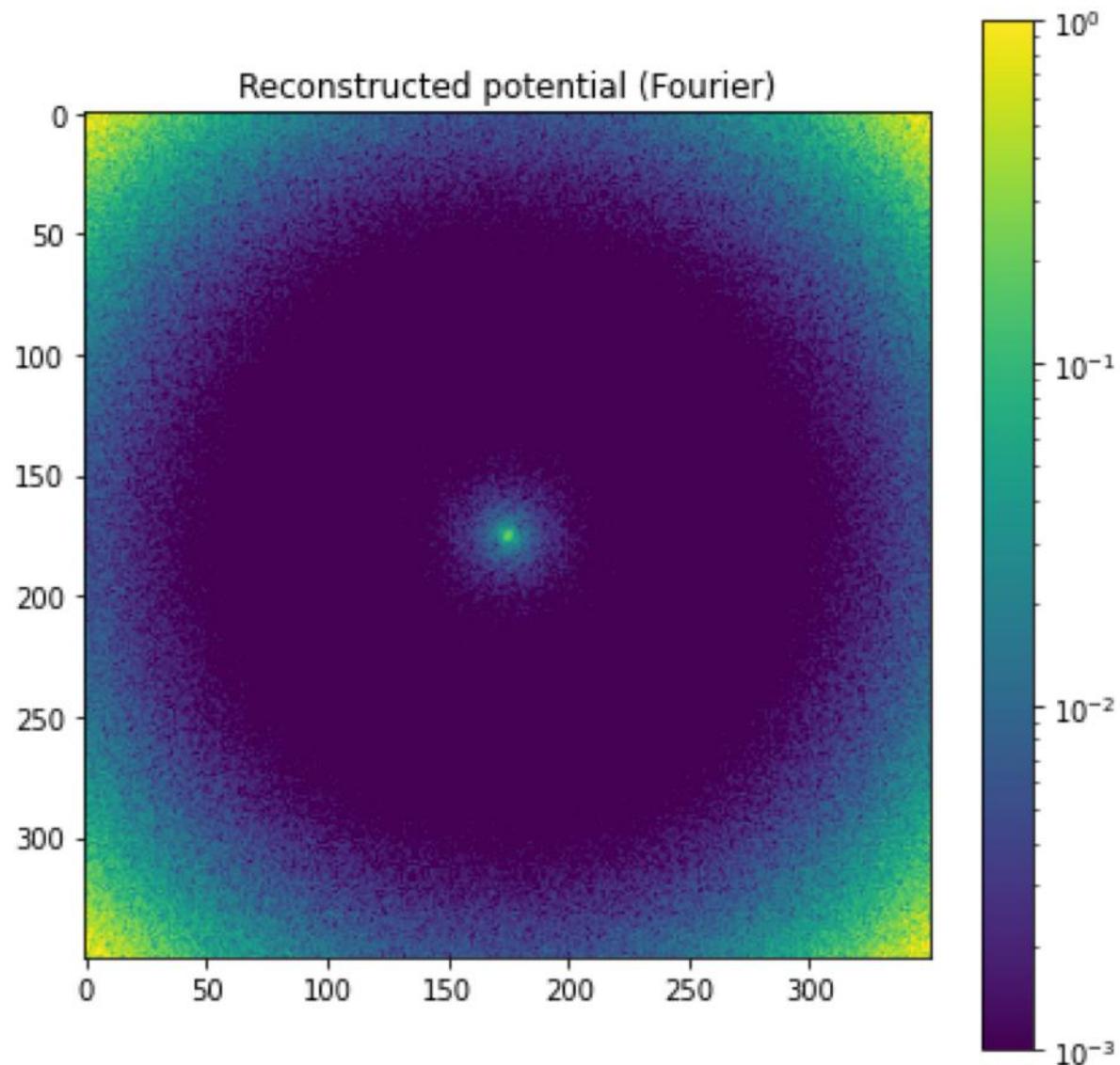
- Contaminants: SZ effect, foreground
  - Instrumental characteristics: PSF, noise
- Combine the maps at different frequencies to remove contaminants, easier when we know the recipe  
→ Best lensed CMB map



# Lensing estimator

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- The CMB k-modes (spatial frequencies, i.e. the different scales) are uncorrelated
- The CMB on our map is lensed, inducing spatial correlations
- Use these correlations to rebuild the lensing potential



2D-Fourier transform of the reconstructed gravitational potential (small k-modes – large scales in the middle)

# Matched filter

- Compares the obtained lensing potential to a NFW profile for a given mass
- We know the NFW profile used in the simulations
- Returns the estimation of the amplitude fitting best the NFW profile. For simulations, we expect to get, in average:

$$\frac{M_{measurement}}{M_{true}} = 1$$

$$\hat{\phi}_0 = \left[ \sum_K \frac{|\Phi(K)|^2}{A(K)} \right]^{-1} \sum_K \frac{\Phi^*(K)}{A(K)} \hat{\phi}(K)$$

NFW lensing potential

Obtained lensing potential

Variance of measure obtained for  $K$

