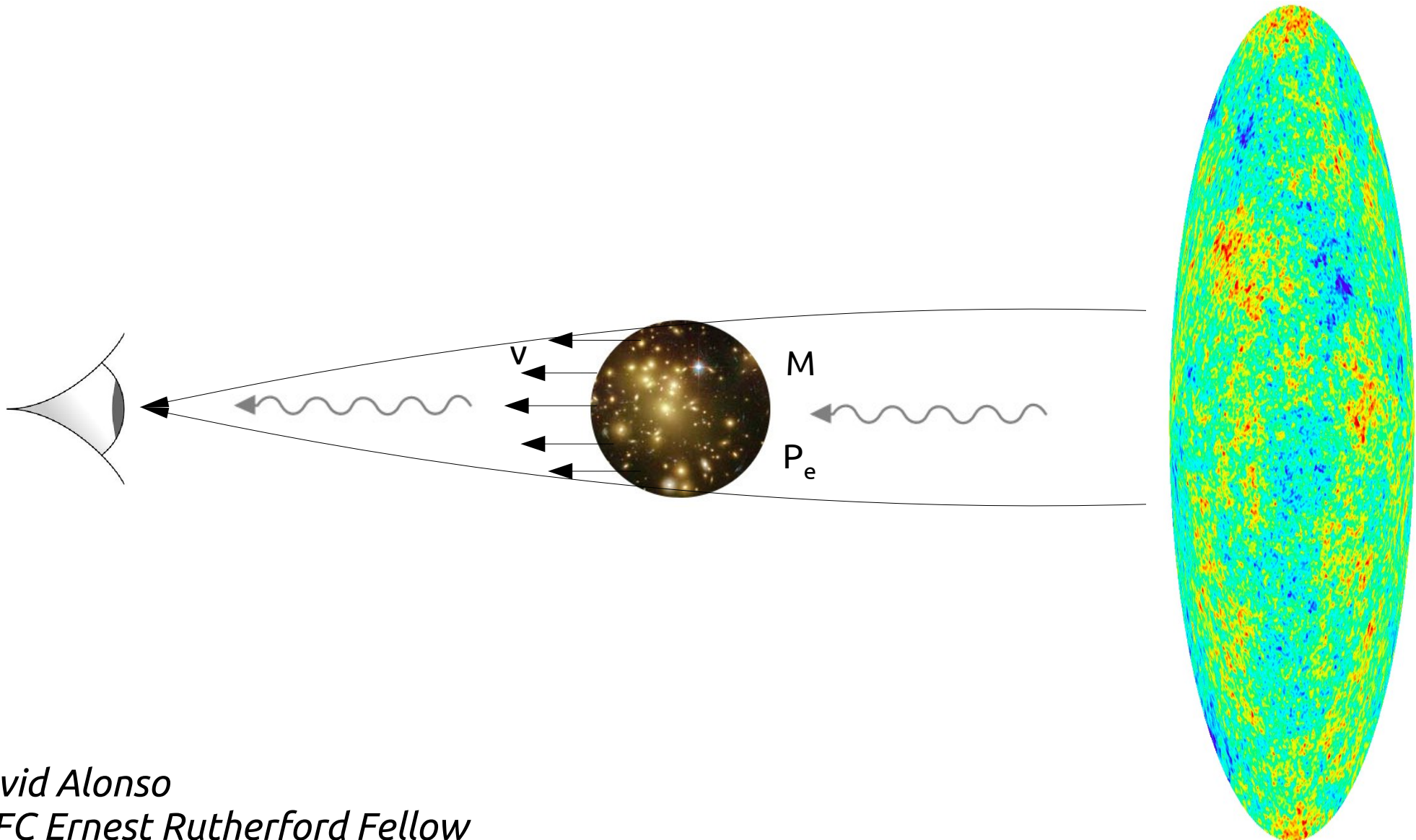


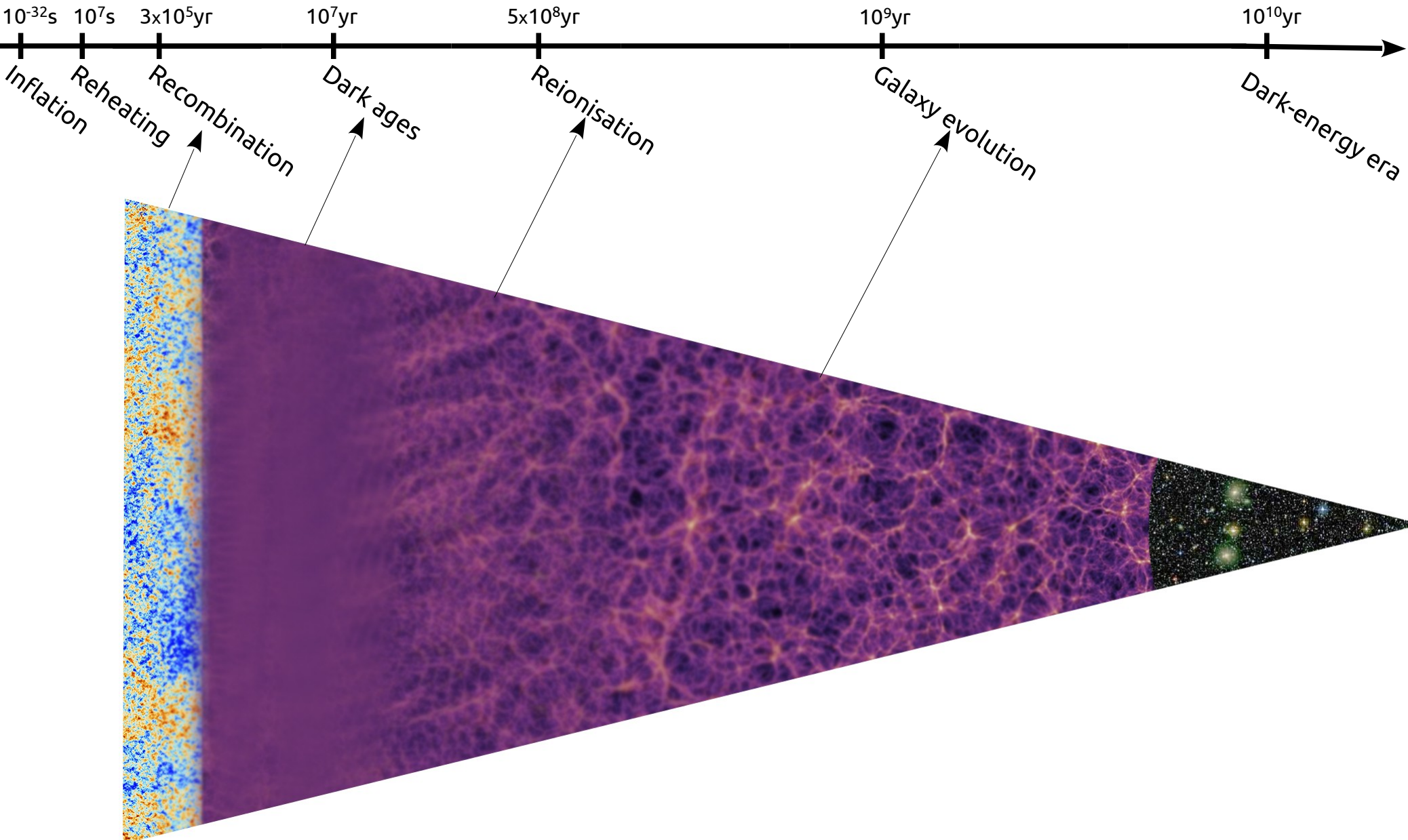
Improving large-scale structure data with CMB secondary anisotropies for cosmology



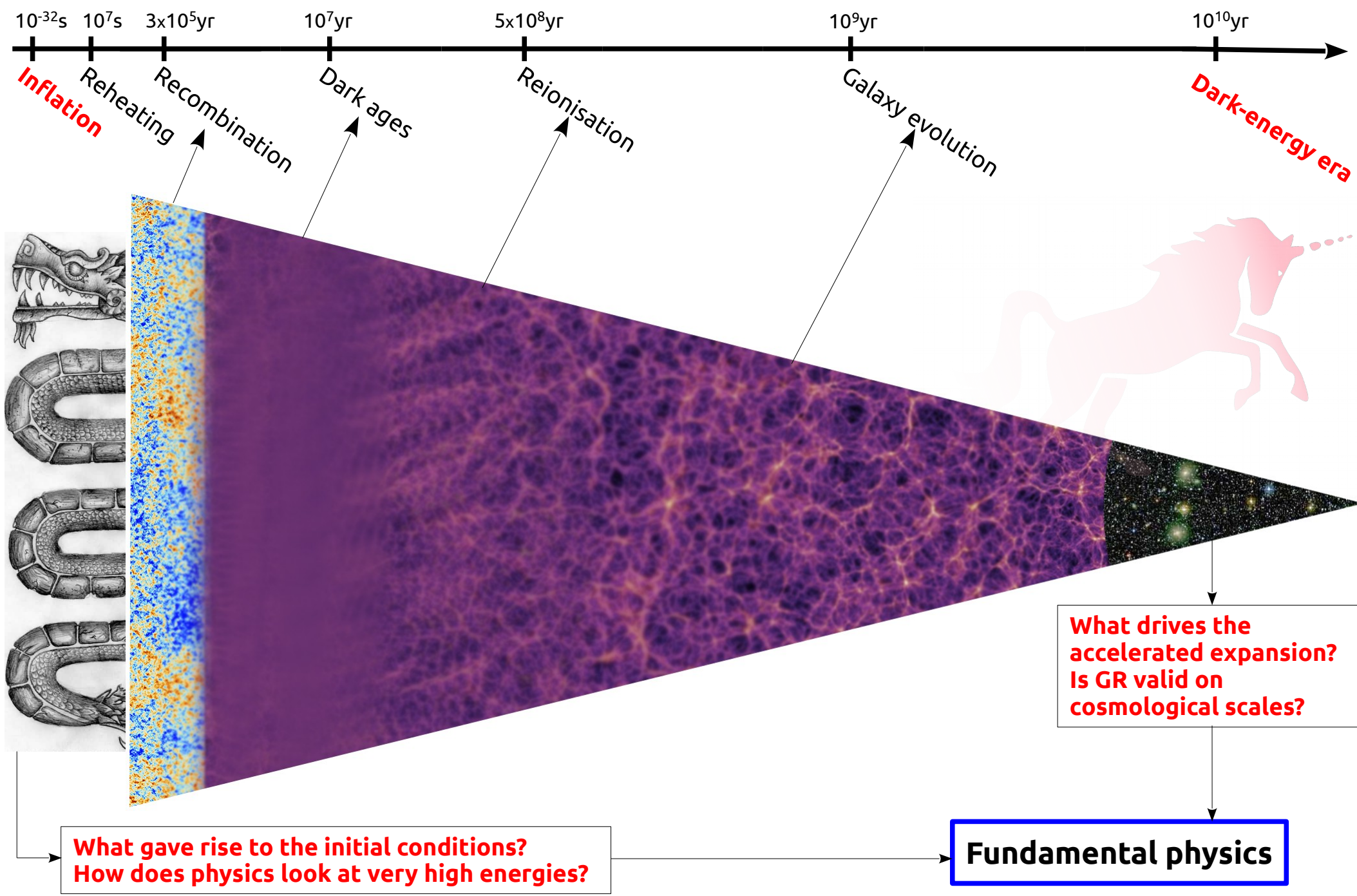
David Alonso
STFC Ernest Rutherford Fellow
University of Oxford

LAL, Orsay, Apr 1st 2019

Cosmological science questions



Cosmological science questions



How will we go about it?

Parameters

$$\begin{matrix} A_s & n_s \\ r & f_{\text{NL}} \end{matrix}$$

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Energy components

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$$\begin{matrix} \Delta(\mathbf{k}, t) \\ \langle |\Delta(\mathbf{k}, t)|^2 \rangle \\ \Downarrow \\ P(k, t) \end{matrix}$$

Matter fluctuations
Power spectrum

Interlude: what is a power spectrum?

$$\rho(\mathbf{x}, t) \longrightarrow \Delta(\mathbf{x}, t) = \frac{\rho(\mathbf{x}, t) - \bar{\rho}(t)}{\bar{\rho}(t)}$$

Density **Overdensity**

Interlude: what is a power spectrum?

$$\rho(\mathbf{x}, t) \longrightarrow \Delta(\mathbf{x}, t) = \frac{\rho(\mathbf{x}, t) - \bar{\rho}(t)}{\bar{\rho}(t)}$$

Density **Overdensity**

Gaussian fields

$$p(\vec{\Delta}) = \frac{\exp \left[-\frac{1}{2} \vec{\Delta}^T \hat{\xi}^{-1} \vec{\Delta} \right]}{\sqrt{\det \left(2\pi \hat{\xi} \right)}}$$

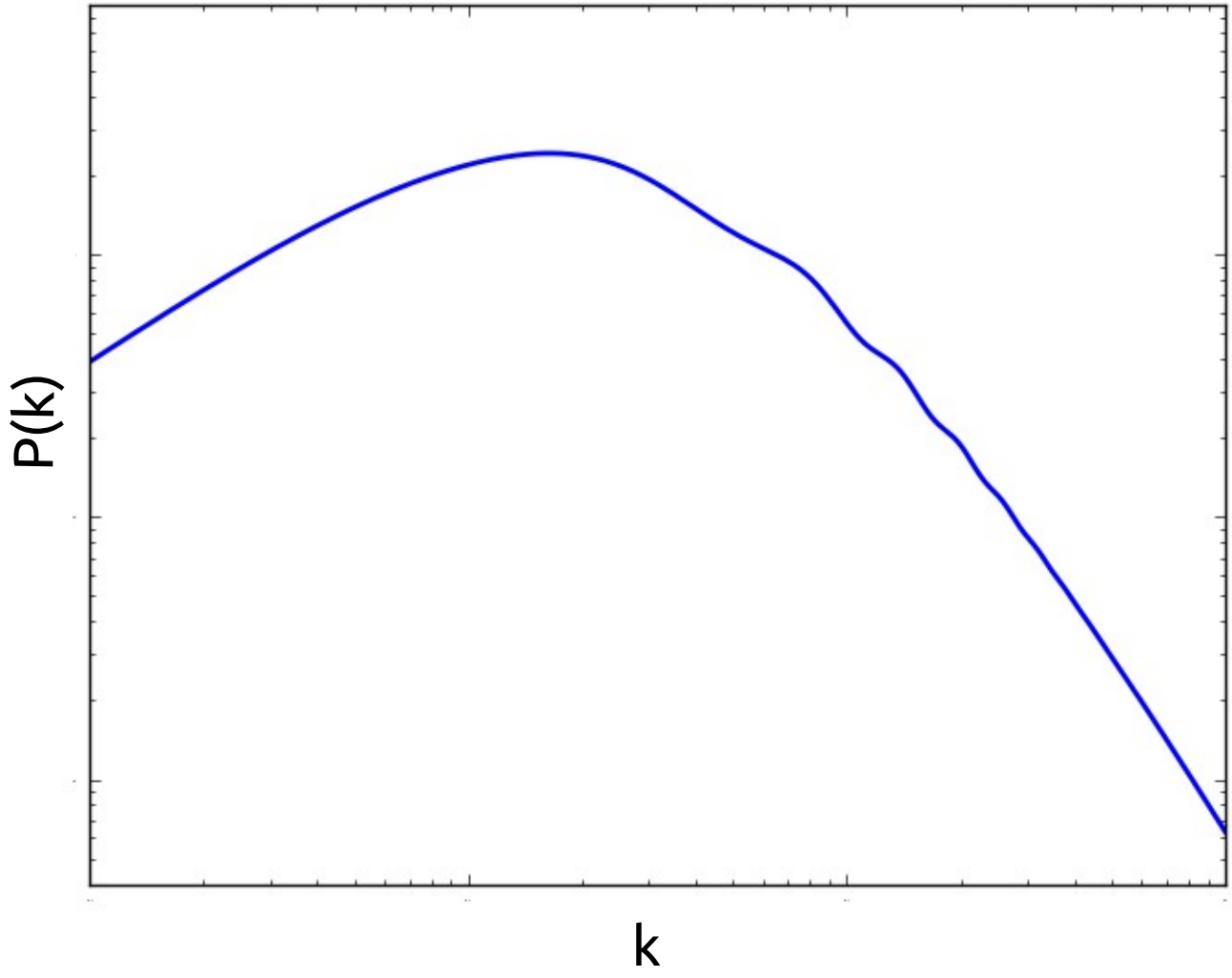
$$\xi(|\mathbf{x} - \mathbf{y}|) = \langle \Delta(\mathbf{x}) \Delta(\mathbf{y}) \rangle$$

Interlude: what is a power spectrum?

$$\Delta(\mathbf{x}) = \int \frac{d\mathbf{k}^3}{(2\pi)^{3/2}} e^{i\mathbf{k}\mathbf{x}} \Delta(\mathbf{k}) \longrightarrow \langle |\Delta(\mathbf{k})|^2 \rangle = \frac{V}{(2\pi)^3} P(k)$$

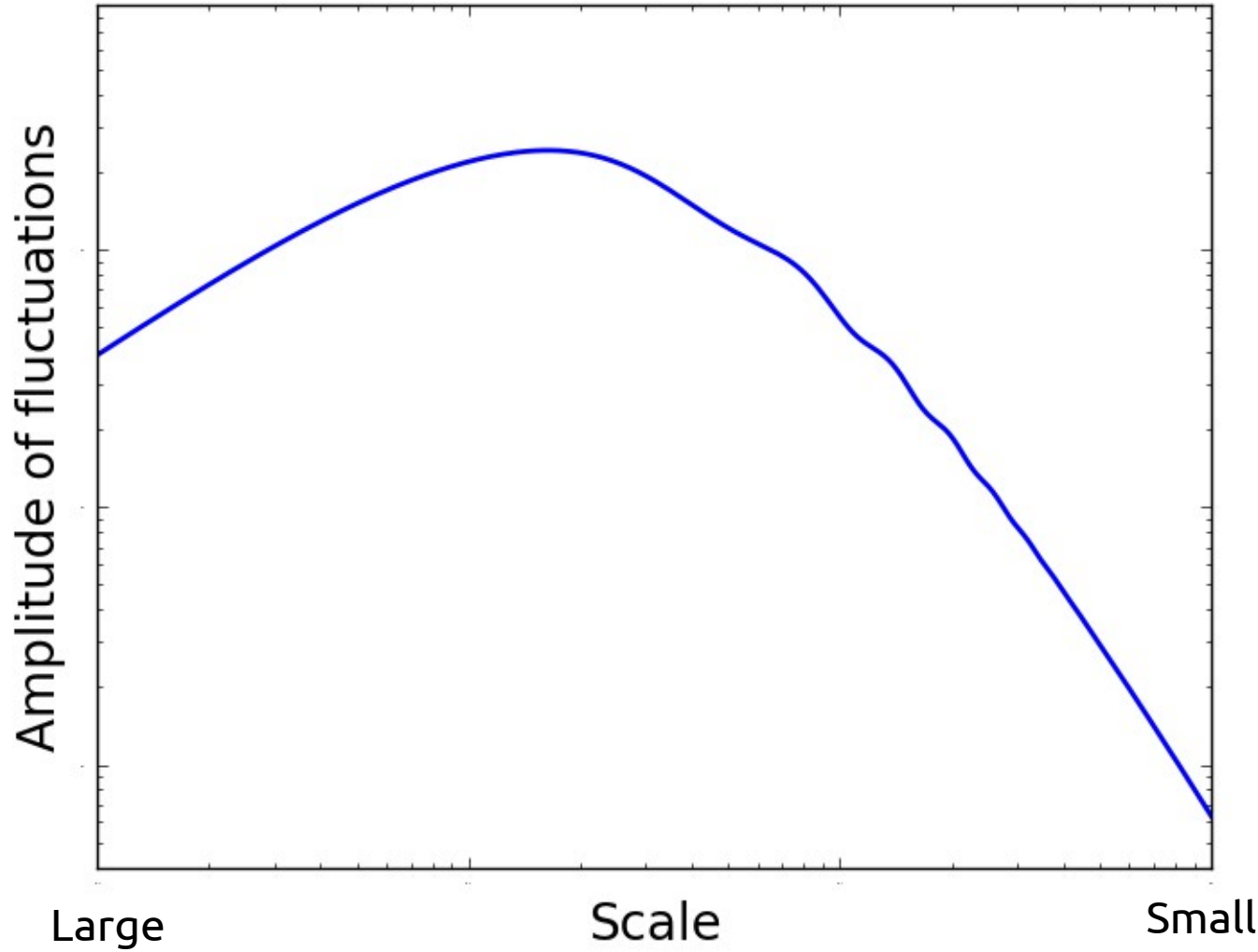
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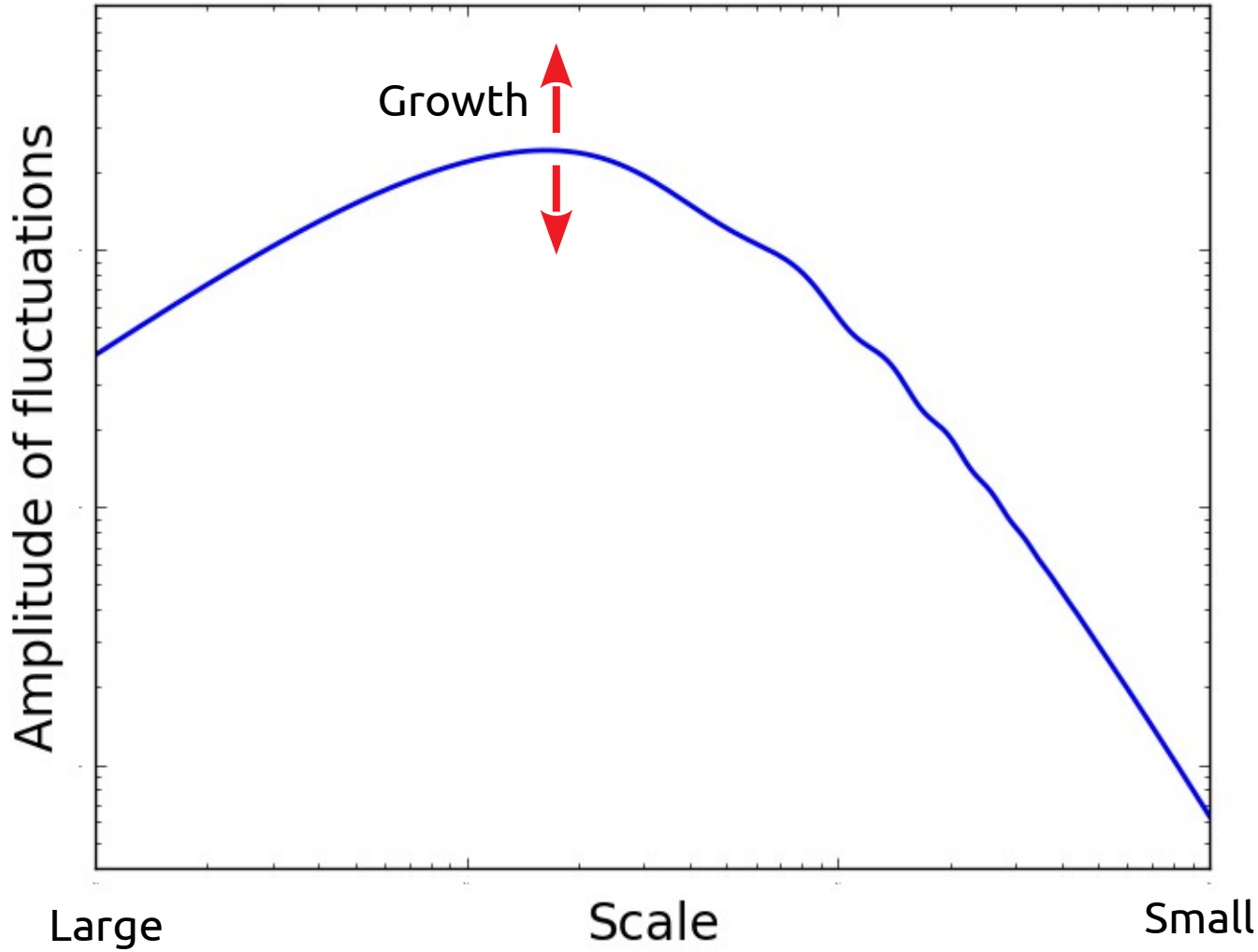
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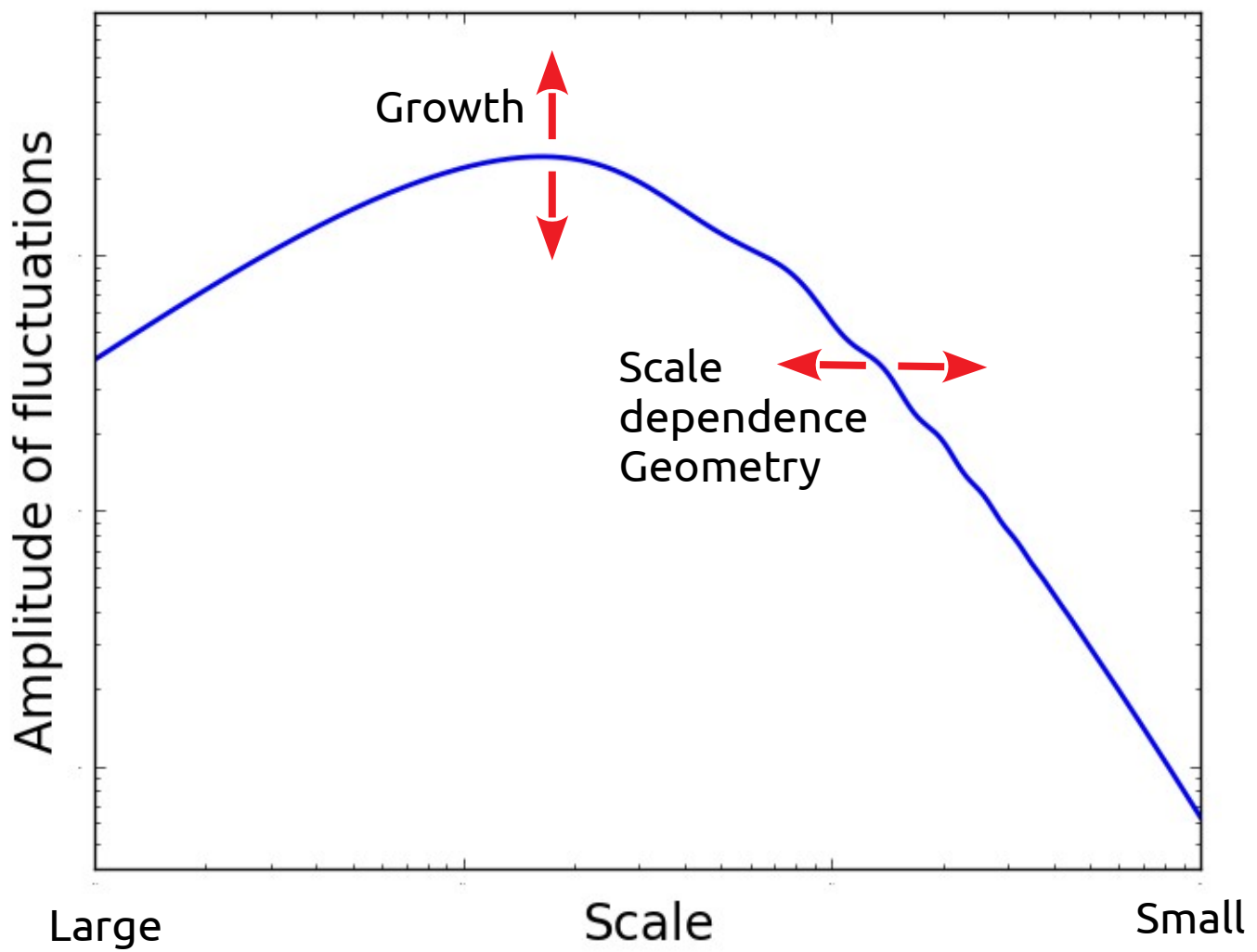
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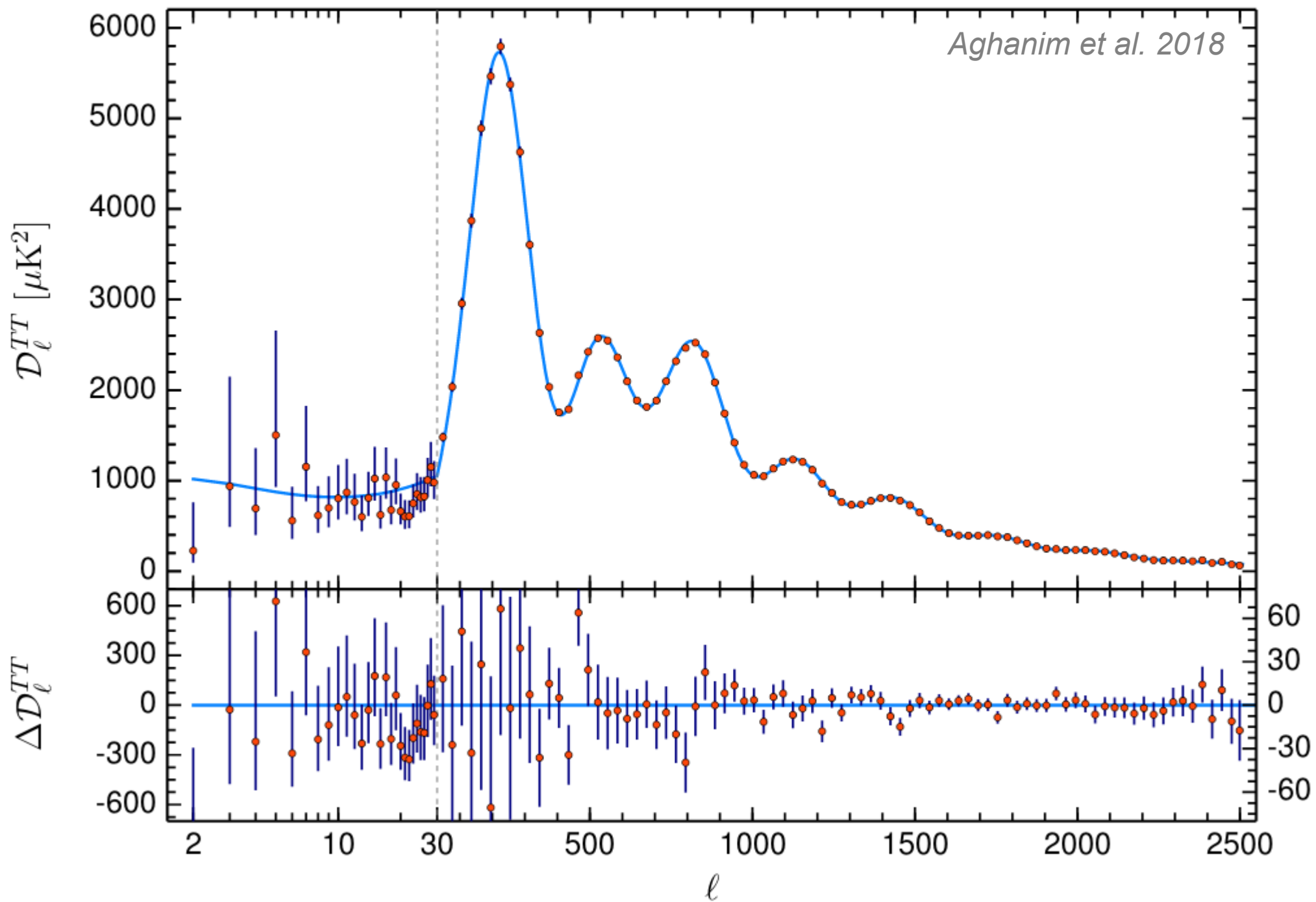


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$$\delta(\theta, \varphi) = \sum_{lm} \delta_{lm} Y_{lm}(\theta, \phi) \quad \langle \delta_{lm}^\alpha \delta_{lm}^{\beta*} \rangle = C_l^{\alpha\beta}$$

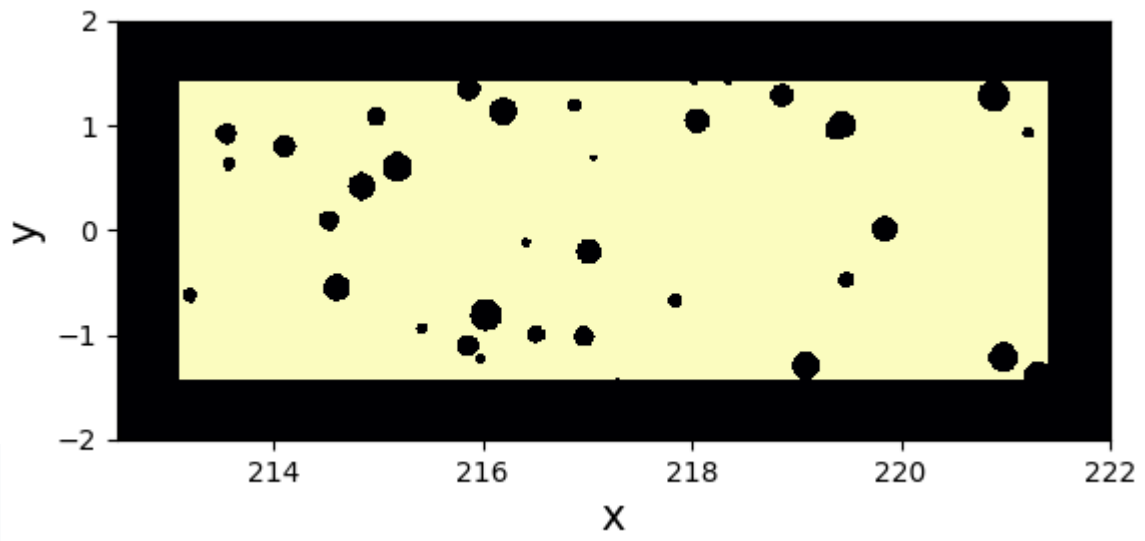
Interlude: what is a power spectrum?



Computing power spectra

Estimating power spectra:

- Patchy sky.
- Contaminated data.
- Optimal method?
- [DA et al. 1809.09603](#)



LSSTDESC / NaMaster

Code Issues 9 Pull requests 3 Projects 0 Wiki Insights Settings

A unified pseudo-Cl framework

Edit

pymaster latest

Search docs

CONTENTS:

- Python API documentation
- Example 1: simple pseudo-Cl computation
- Example 2: Bandpowers

Docs » Welcome to pymaster's documentation!

Edit on GitHub

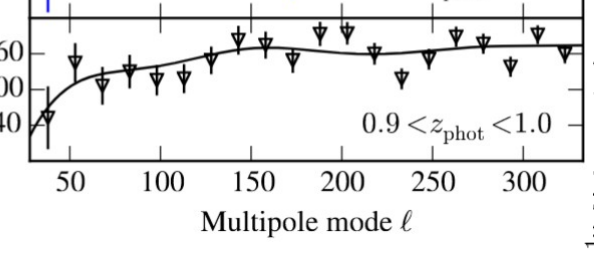
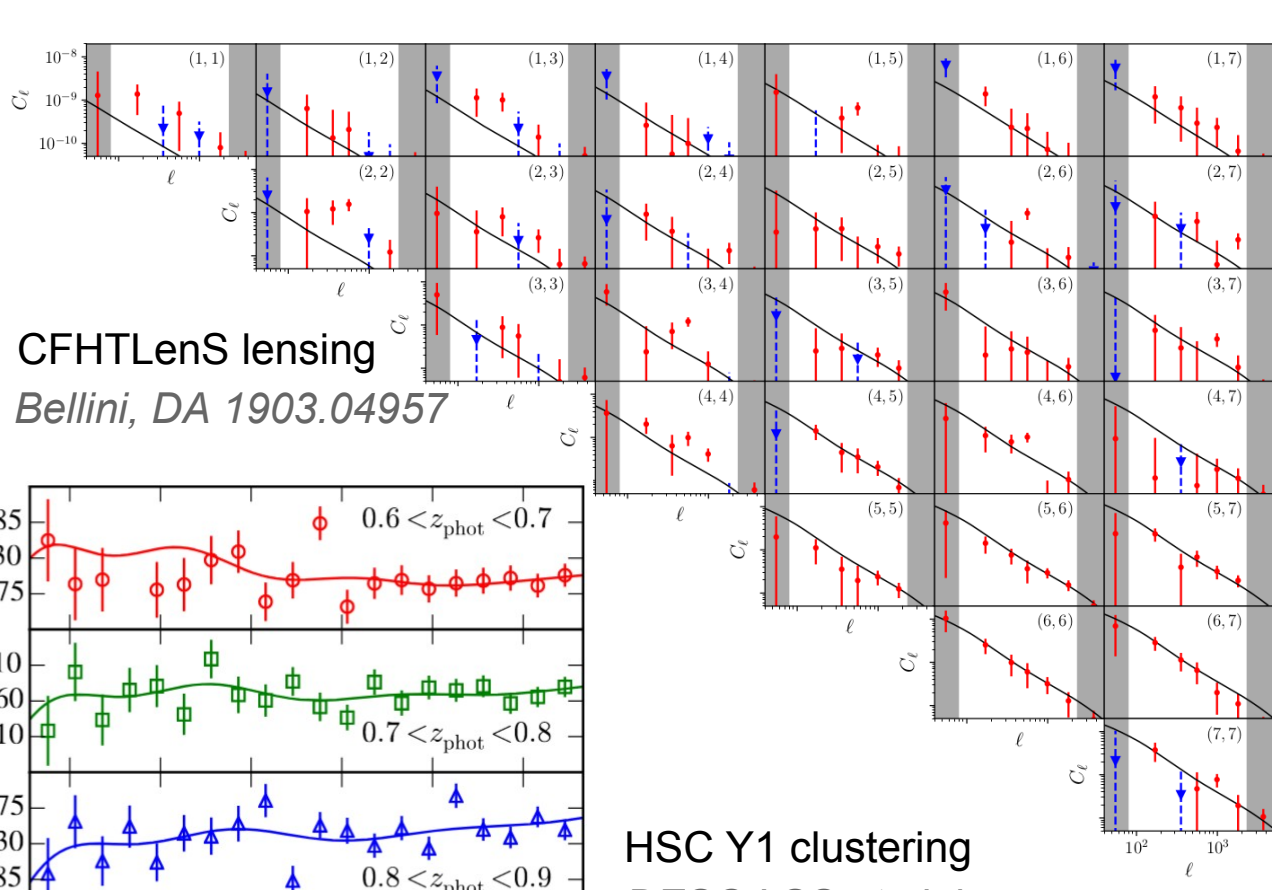
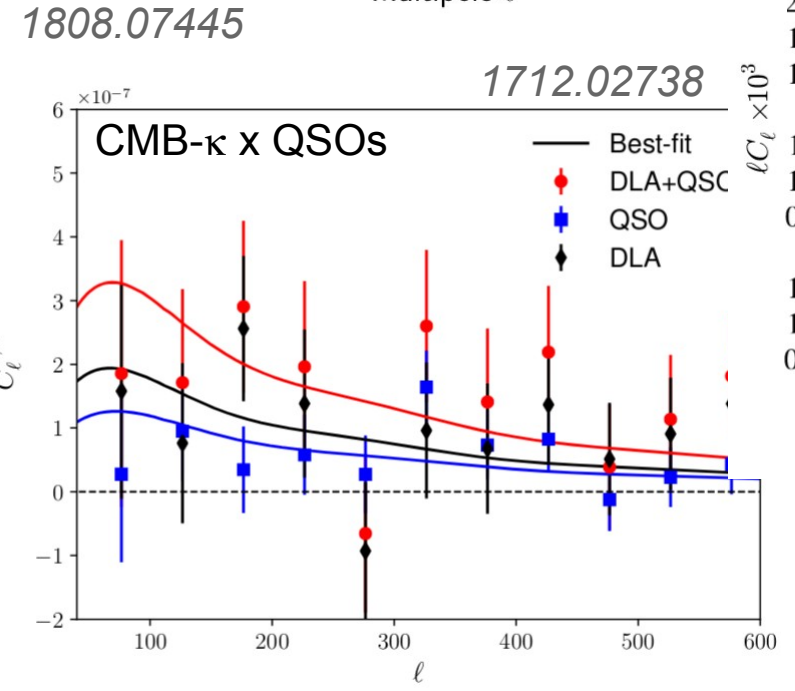
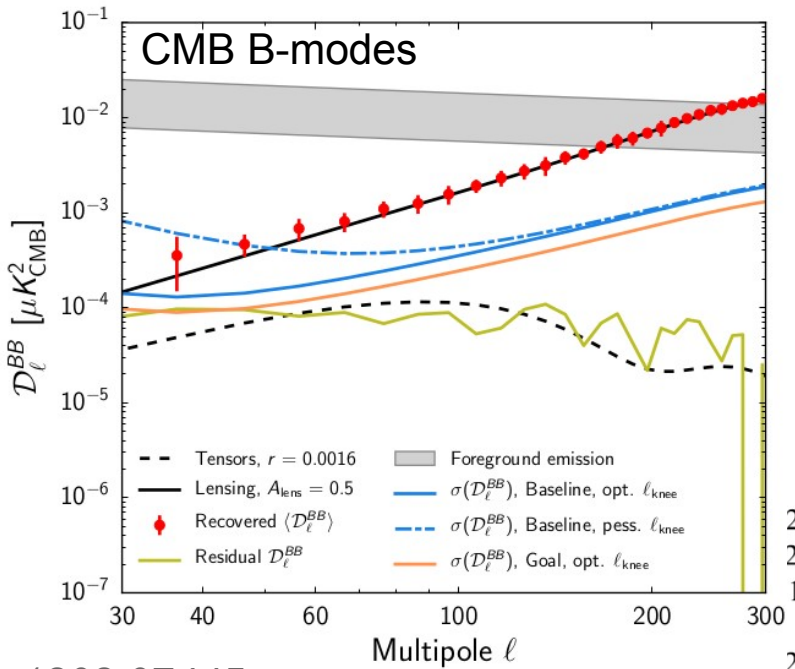
Welcome to pymaster's documentation!

pymaster is the python implementation of the NaMaster library. The main purpose of this library is to provide support to compute the angular power spectrum of fields defined on a limited region of the sphere using the so-called pseudo-CL formalism.

Code: <https://github.com/LSSTDESC/NaMaster>

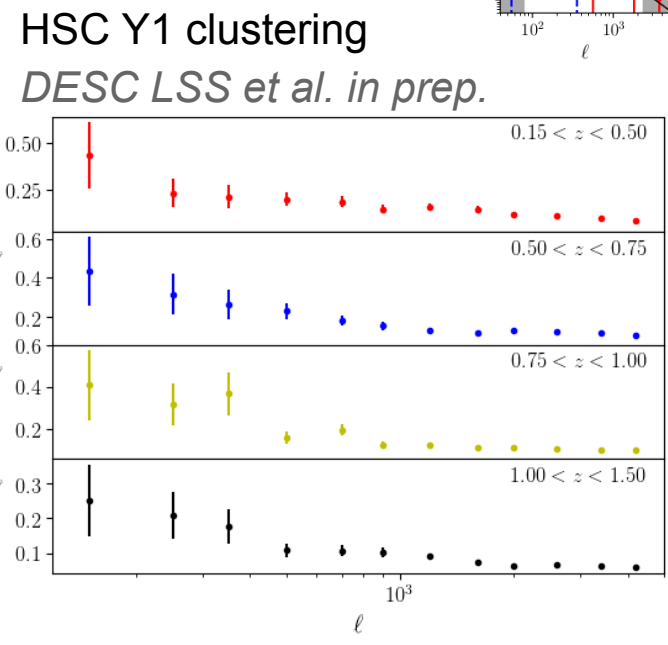
Docs: <https://namaster.readthedocs.io/en/latest/index.html>

Computing power spectra



DES Y1 clustering

1807.10163



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Matter fluctuations
Power spectrum

Observables

$$\underline{\Delta^\alpha(\theta, \phi, \lambda)}$$

$\alpha =$:
CMB temperature
CMB polarisation
Galaxy density
Galaxy shapes
Ly α absorption
21cm flux
...

How will we go about it?

Parameters

$$A_s \quad n_s$$

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$$\Delta(\mathbf{k}, t)$$

$$\langle |\Delta(\mathbf{k}, t)|^2 \rangle$$

$$\Downarrow$$

$$P(k, t)$$

Matter fluctuations
 Power spectrum

Observables

$$\Delta^\alpha(\theta, \phi, \lambda)$$

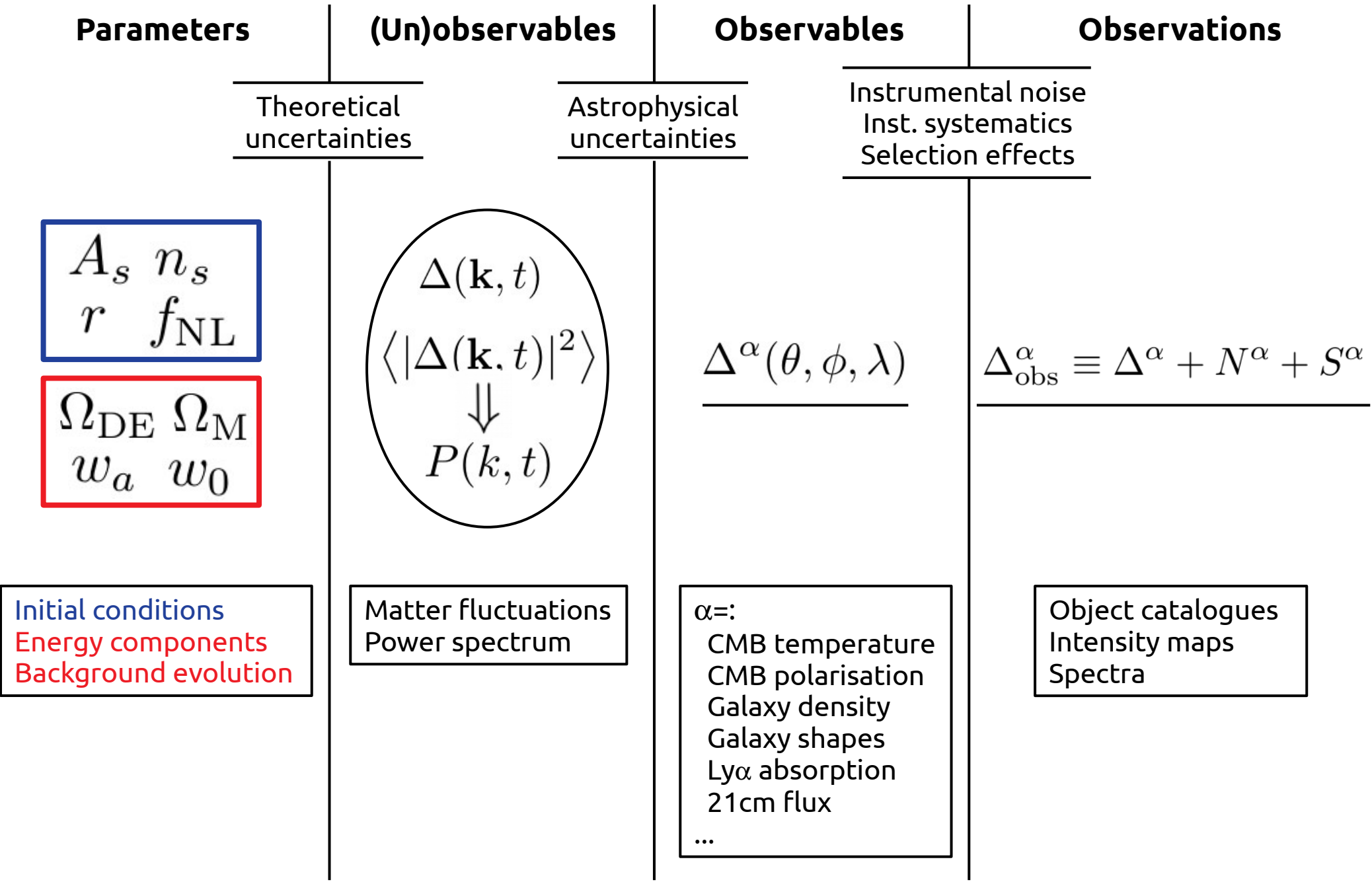
$\alpha =$:
 CMB temperature
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 Galaxy shapes
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 21cm flux
 ...

Observations

$$\Delta_{\text{obs}}^\alpha \equiv \Delta^\alpha + N^\alpha + S^\alpha$$

Object catalogues
 Intensity maps
 Spectra

How will we go about it?



Cosmology with large-scale structure

Large-Scale Structure:

- DE affects cosmic density field
- Galaxy distribution \leftrightarrow matter density
- Main systematic \rightarrow galaxy-matter connection
- In general:

$$\delta_g(x) = f[\delta_M(y)] + \varepsilon(x)$$

- On large scales:

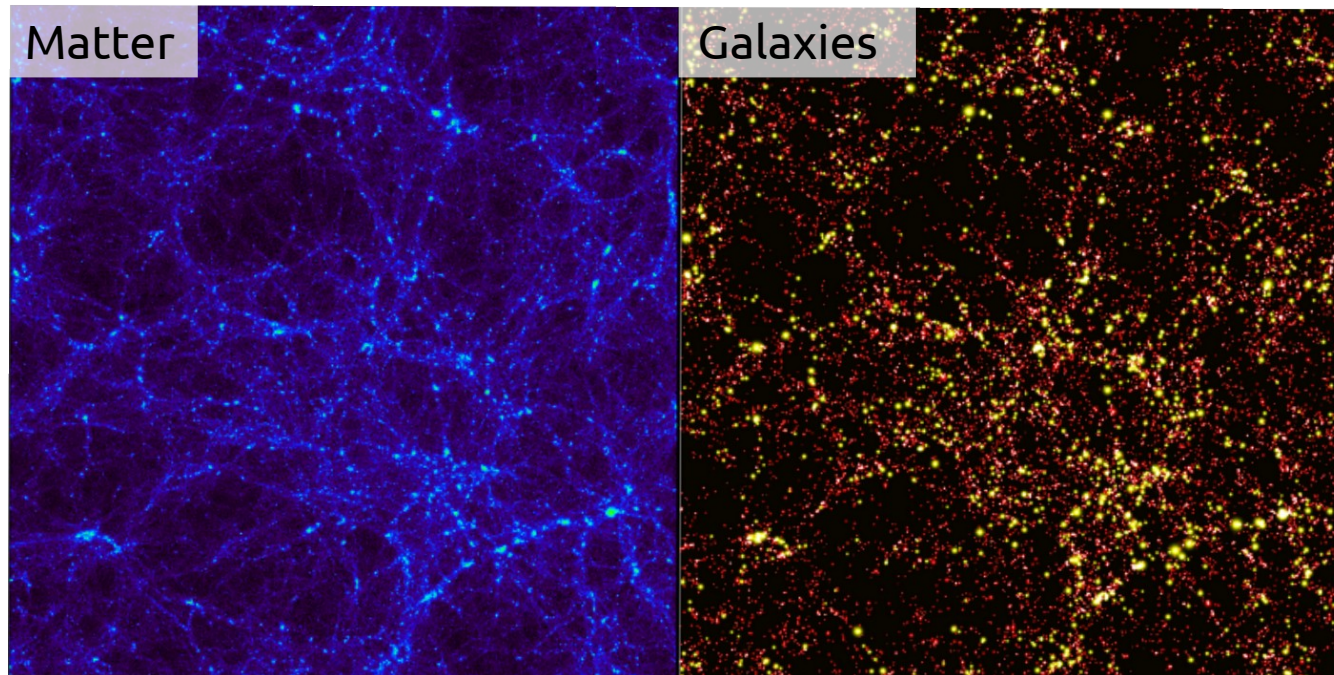
$$\delta_g \sim b_g \delta_M$$

Kaiser 1984

Mo & White 1995

Sheth & Tormen 1999

McDonald & Roy 0902.0991



Credit: Herschel Space Observatory

Cosmology with large-scale structure

Large-Scale Structure: Galaxy clustering:

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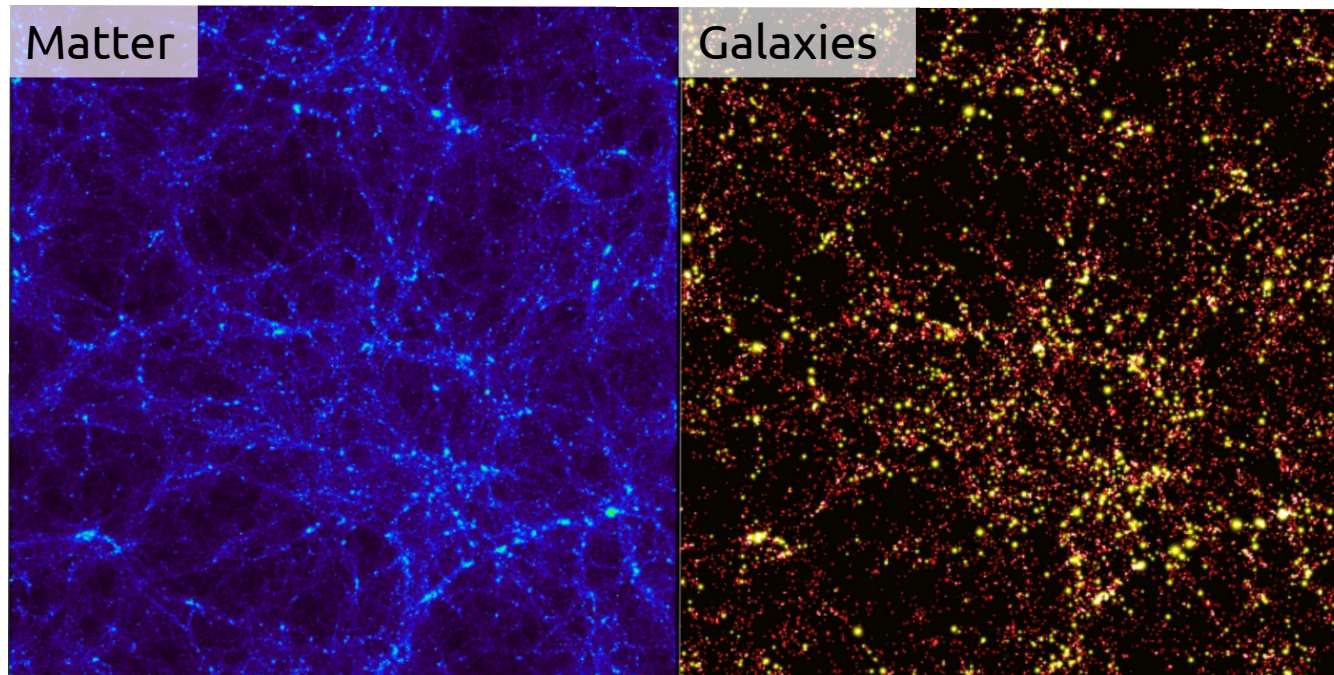
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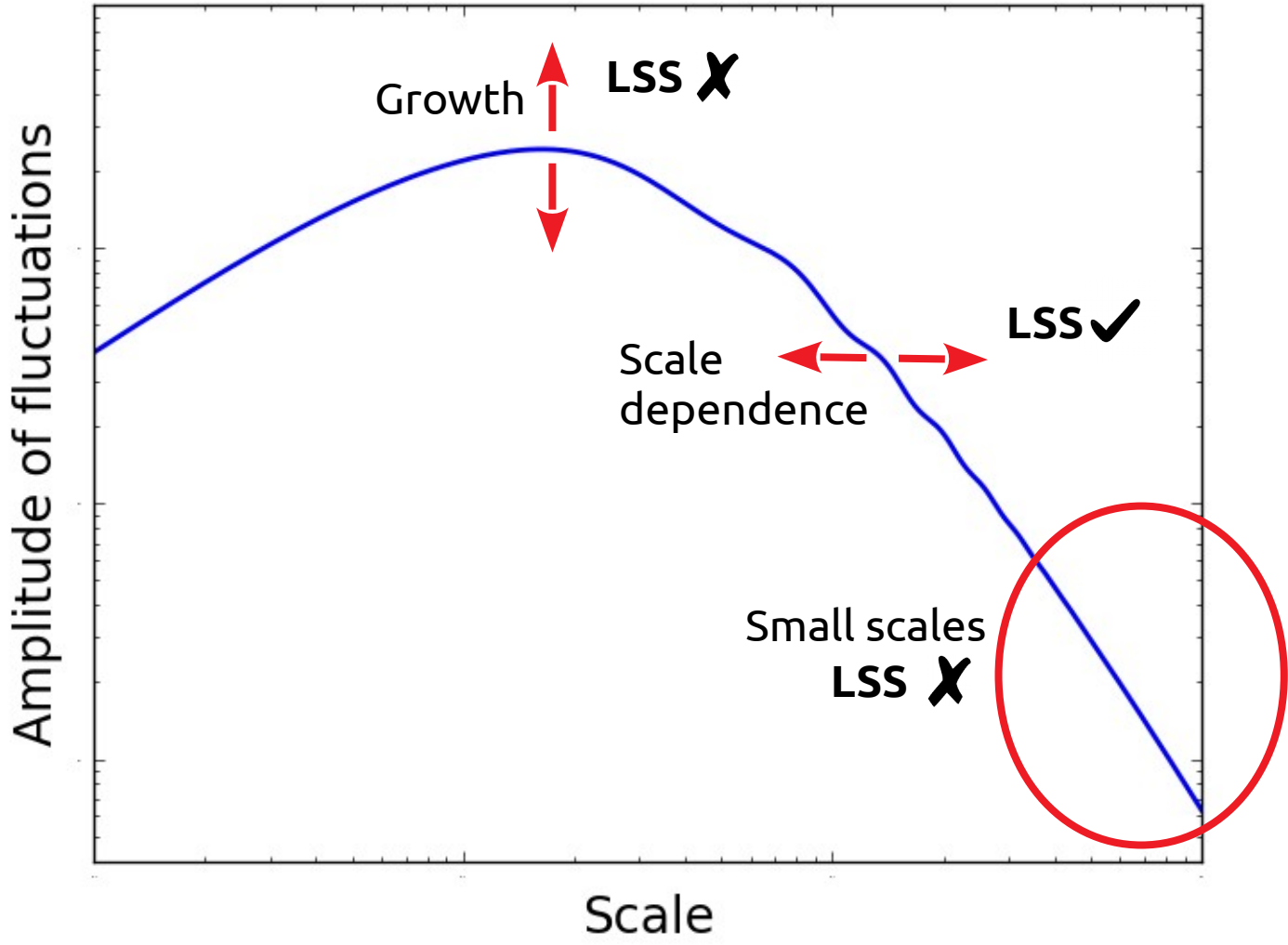
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Cosmology with large-scale structure

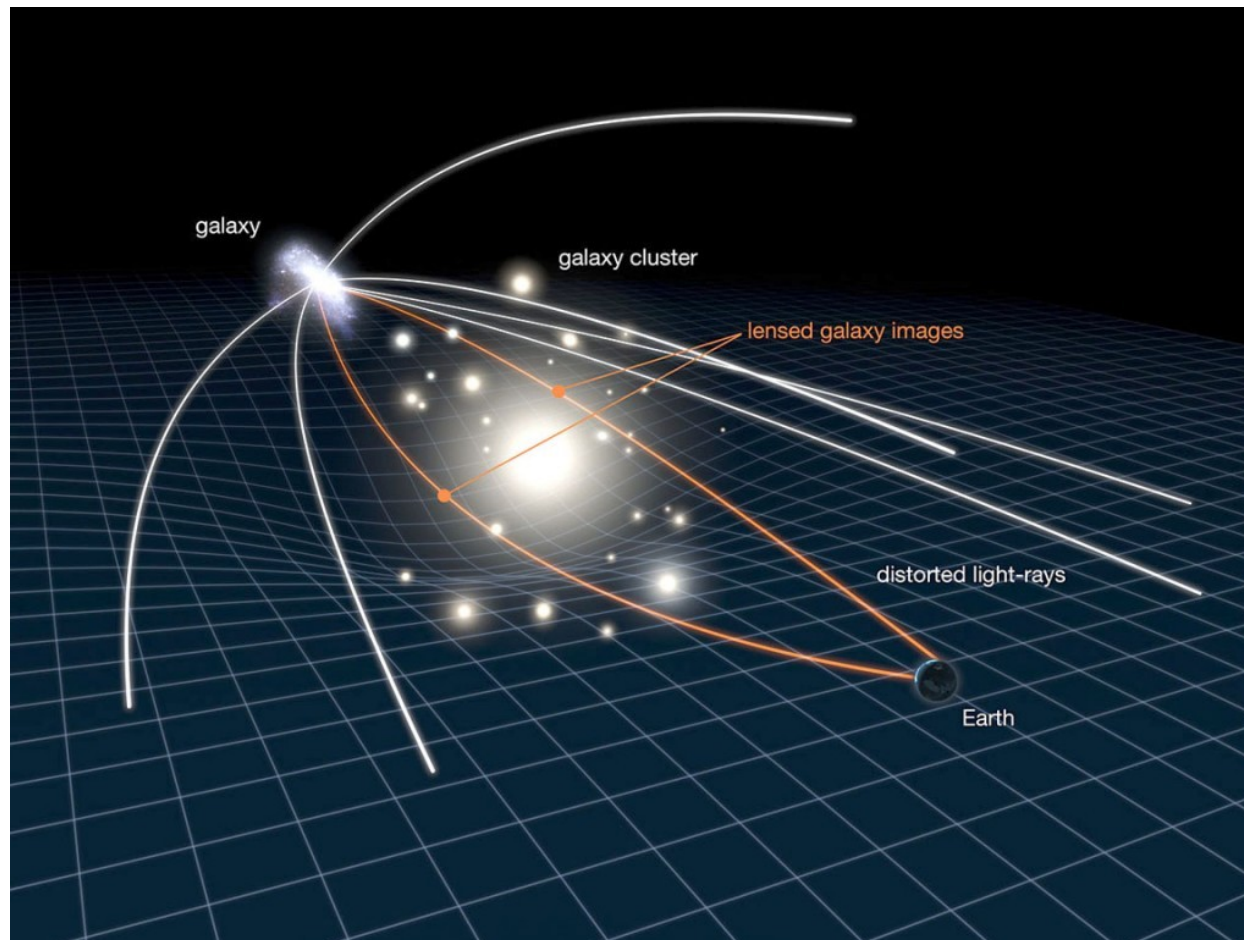
Galaxy clustering:



Cosmology with large-scale structure

Weak lensing:

- Intervening matter modifies observed galaxy shapes.
- Tracer of the true matter distribution → no bias!
- Large radial projection kernel → no scale-dependence

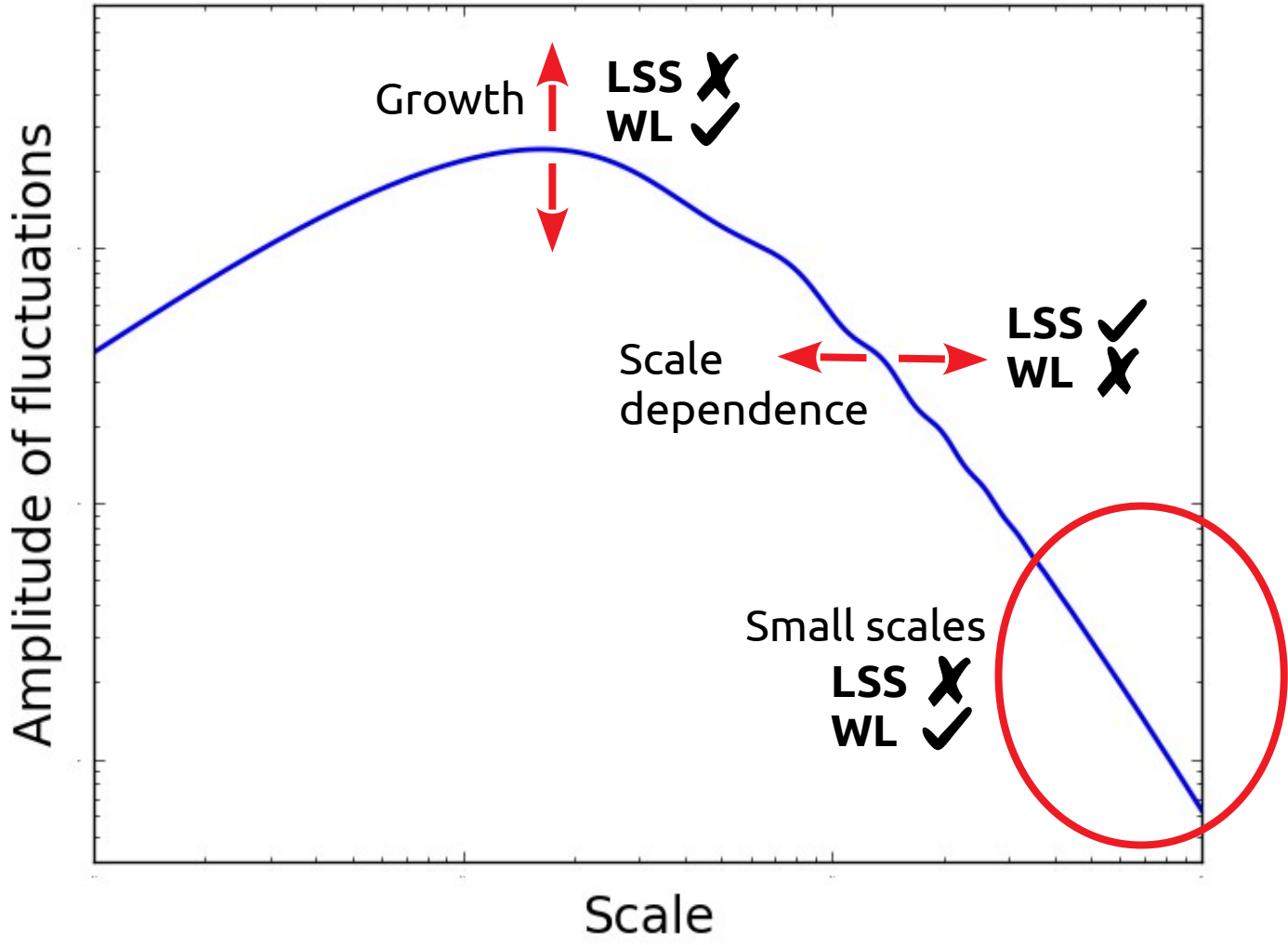


*Kaiser 1992
Bartelmann & Schneider 1999*

Credit: NASA/ESA

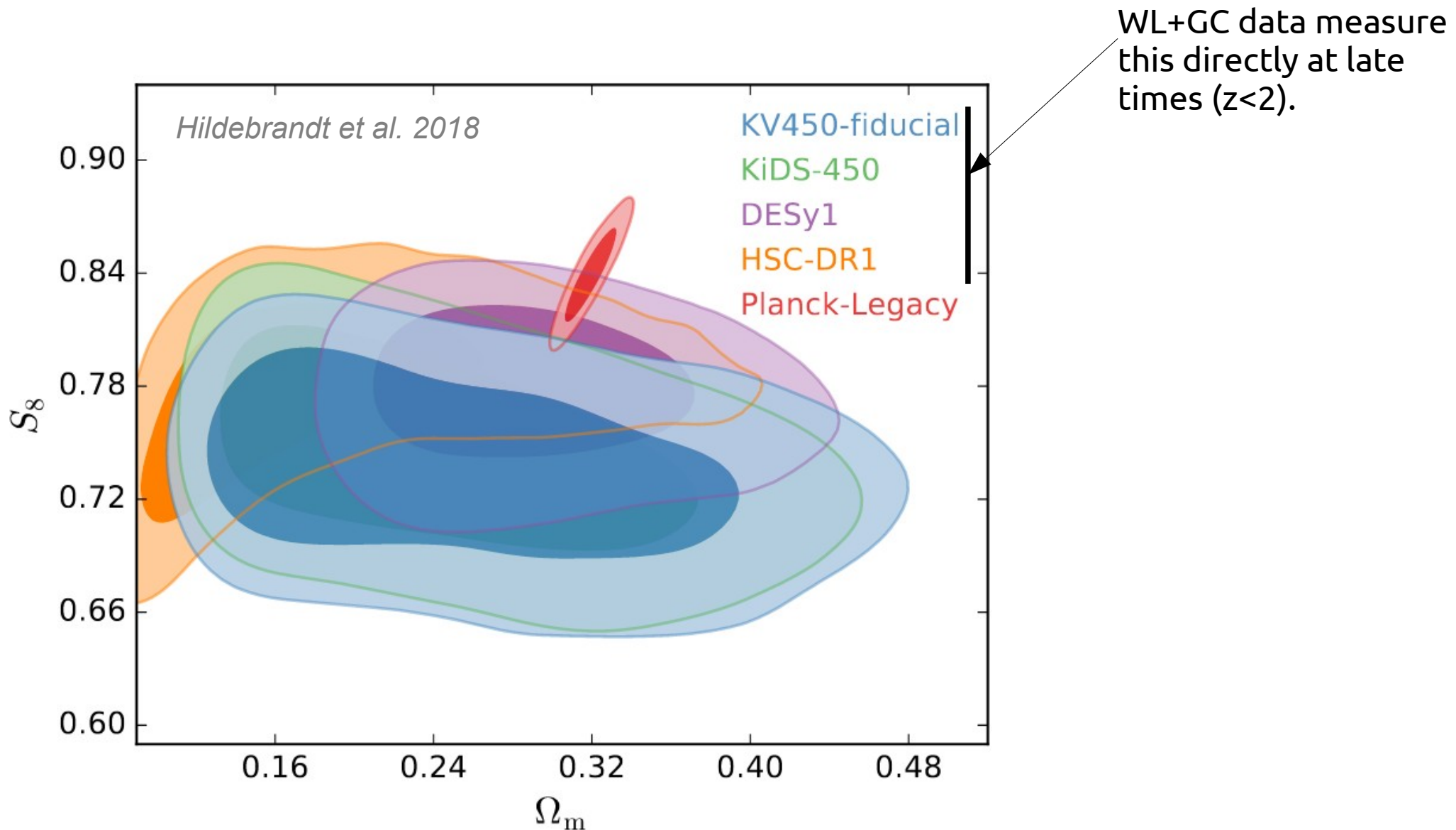
Cosmology with large-scale structure

GC-WL complementarity



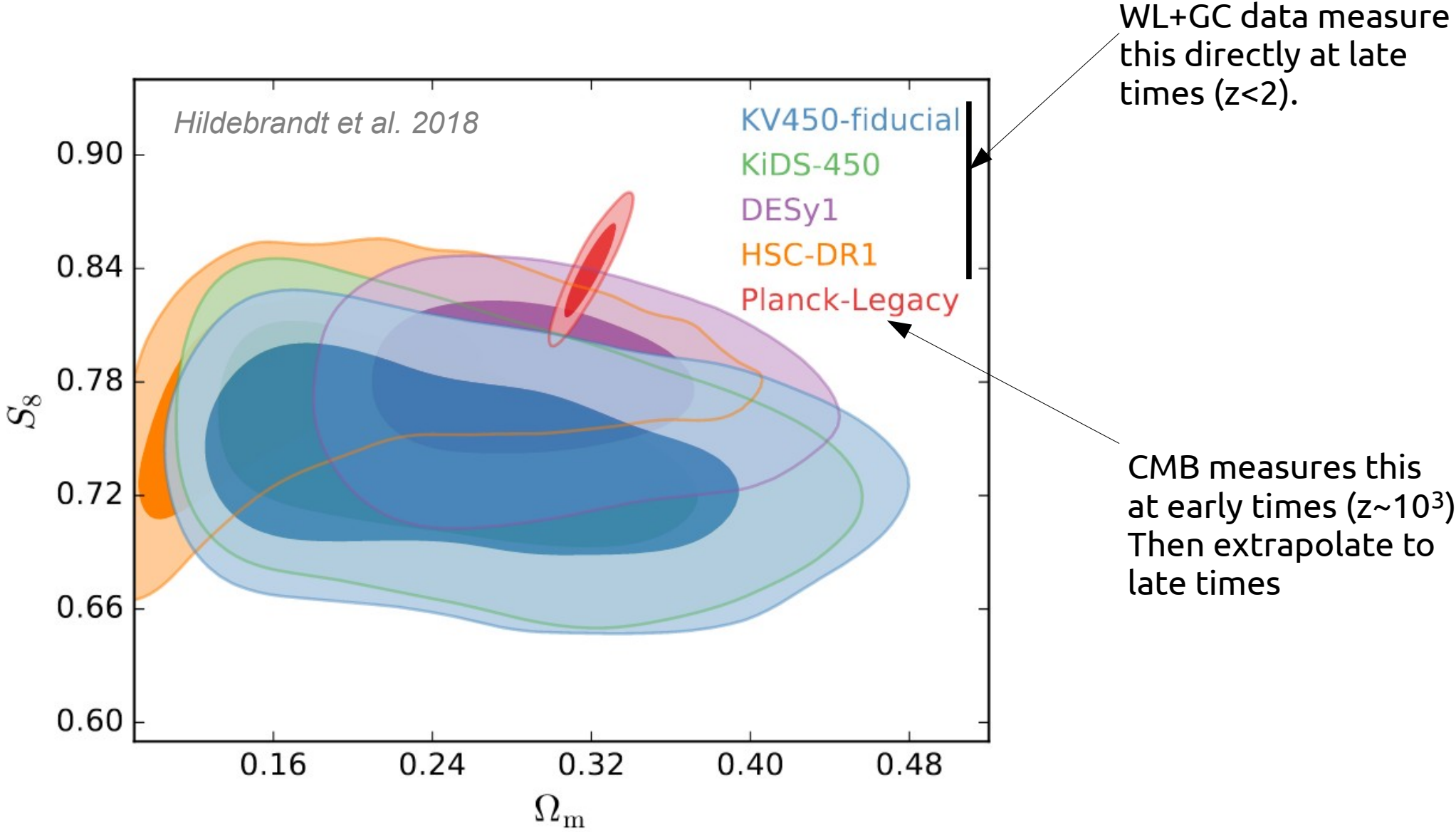
Tension 1: the amplitude of fluctuations from lensing

S_8 → Overall “amplitude” of density fluctuations at late times.



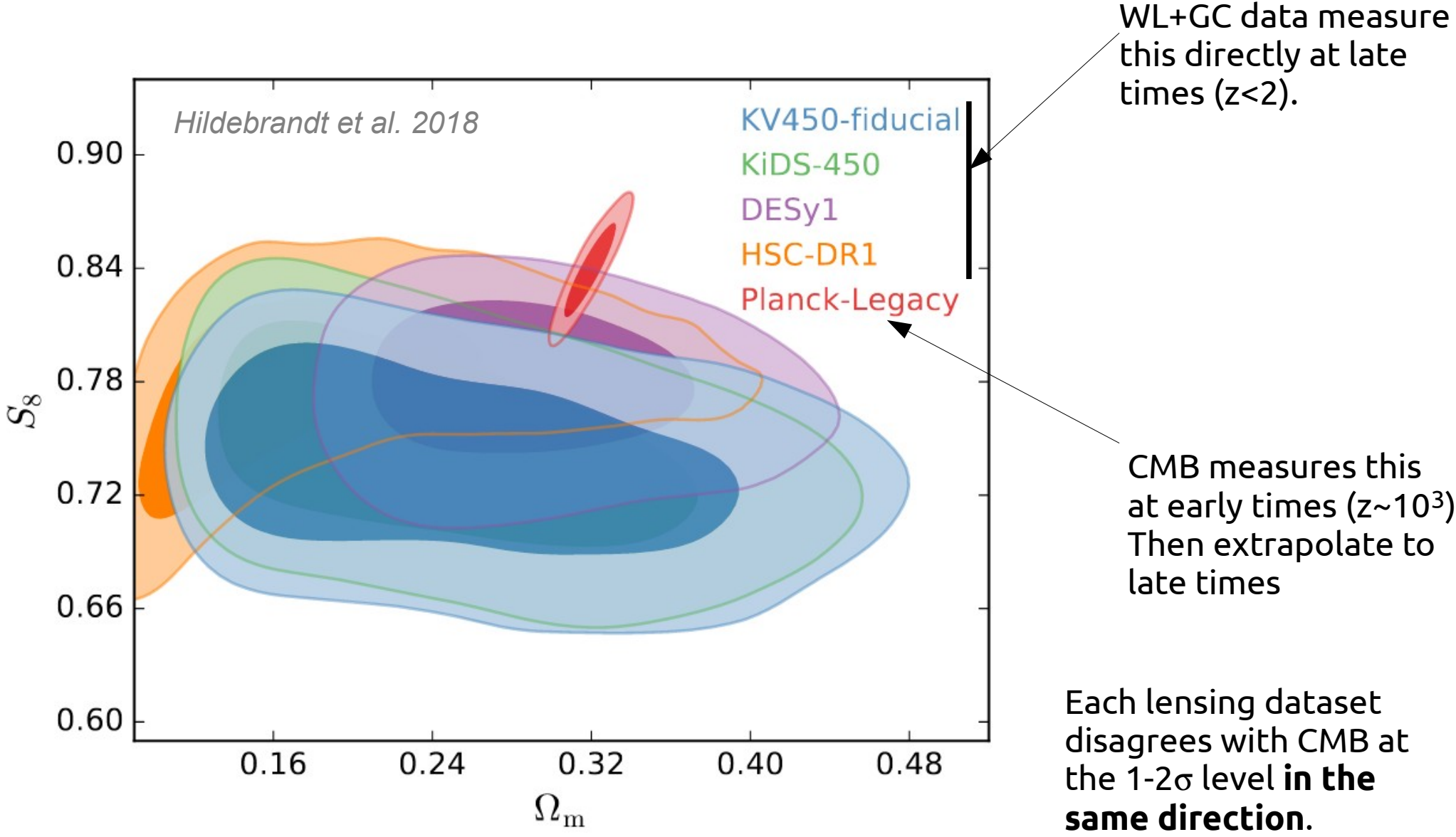
Tension 1: the amplitude of fluctuations from lensing

$S_8 \rightarrow$ Overall “amplitude” of density fluctuations at late times.



Tension 1: the amplitude of fluctuations from lensing

$S_8 \rightarrow$ Overall “amplitude” of density fluctuations at late times.



Example: the LSST



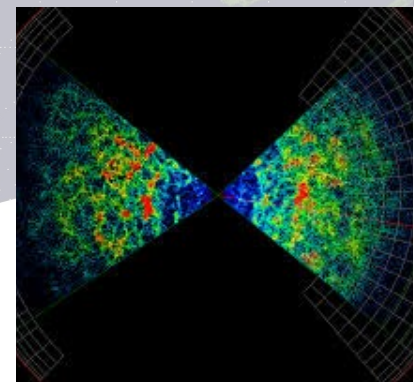
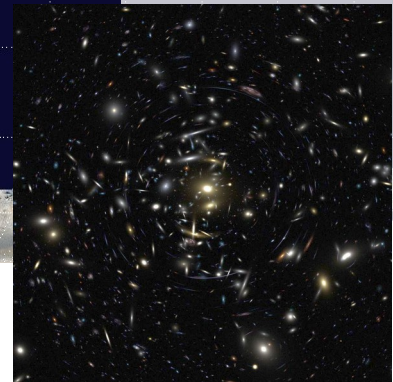
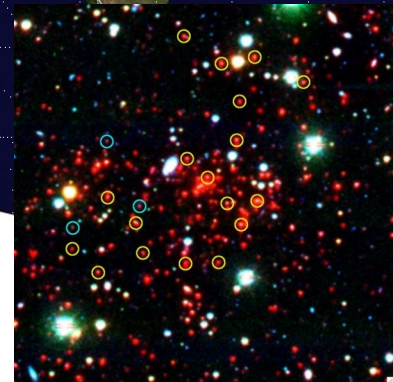
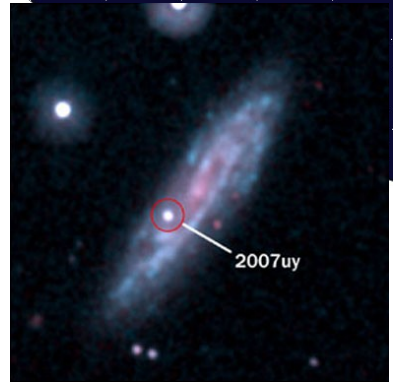
Outstanding numbers:

- World's largest imager
 - 8.4 m, 9.6 sq-deg FOV
- Wide: 20K sq-deg
- Deep: $r \sim 27$
- Fast: ~ 100 visits per year
- Big data: ~ 15 TB per day

Dark Energy Science Collaboration:

- Supernovae
- Cluster science
- Strong lensing
- **Weak lensing**
- **Large-scale structure**

LSST



Example: the LSST

Talk to Stephane, Julien, Jean-Eric, Jeremy!



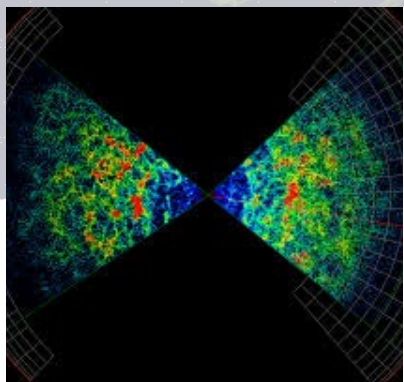
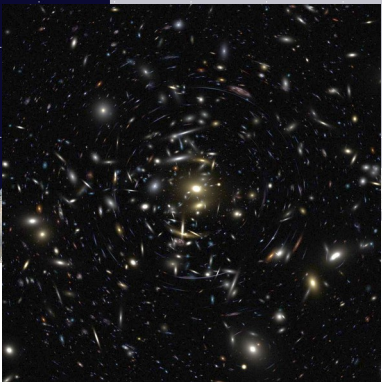
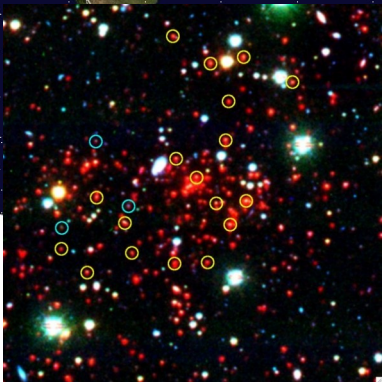
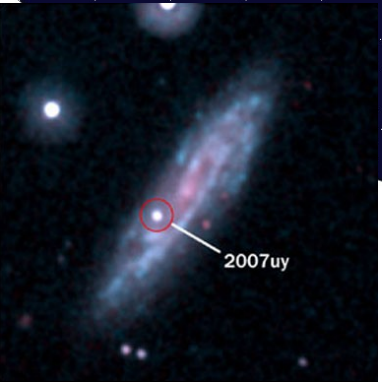
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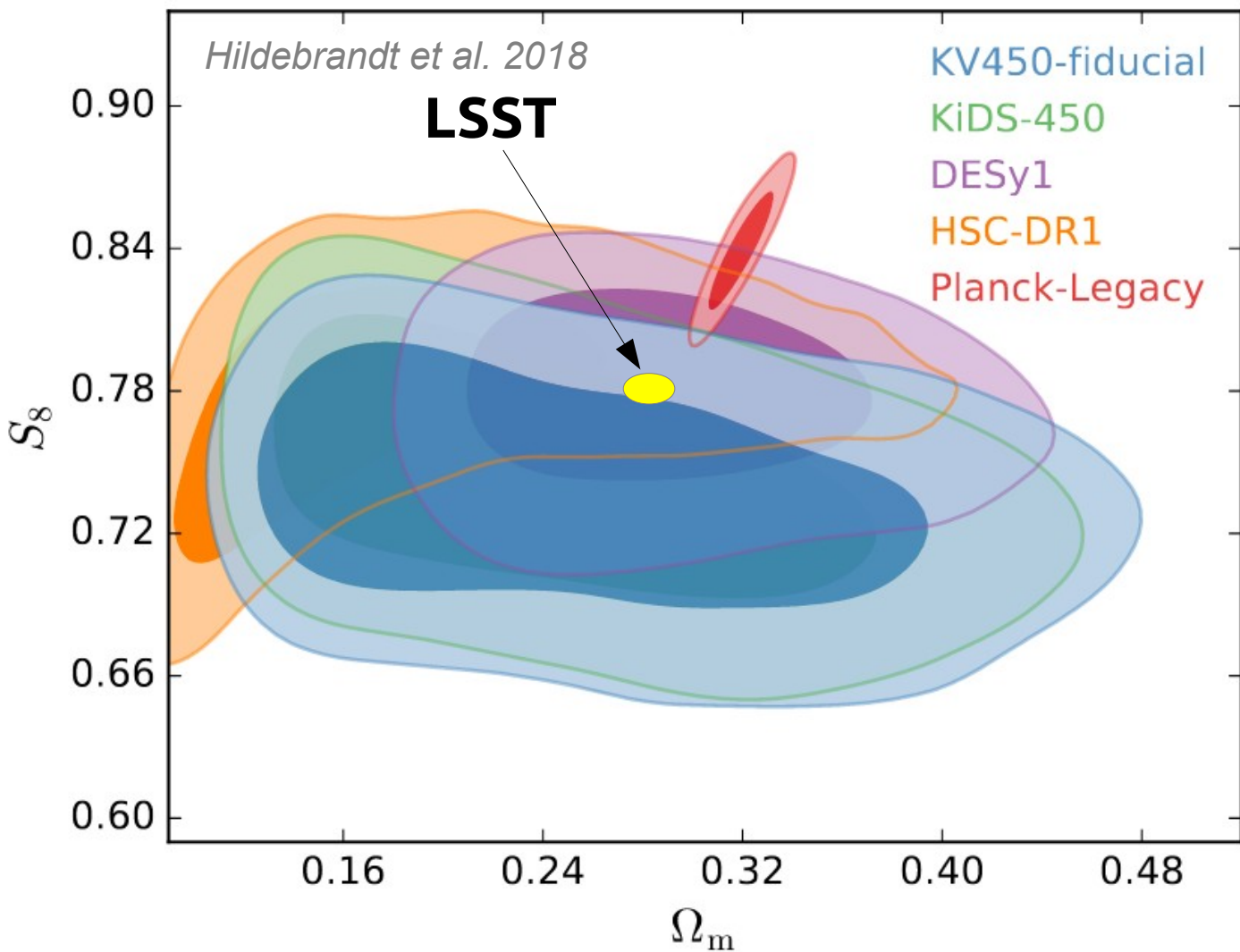
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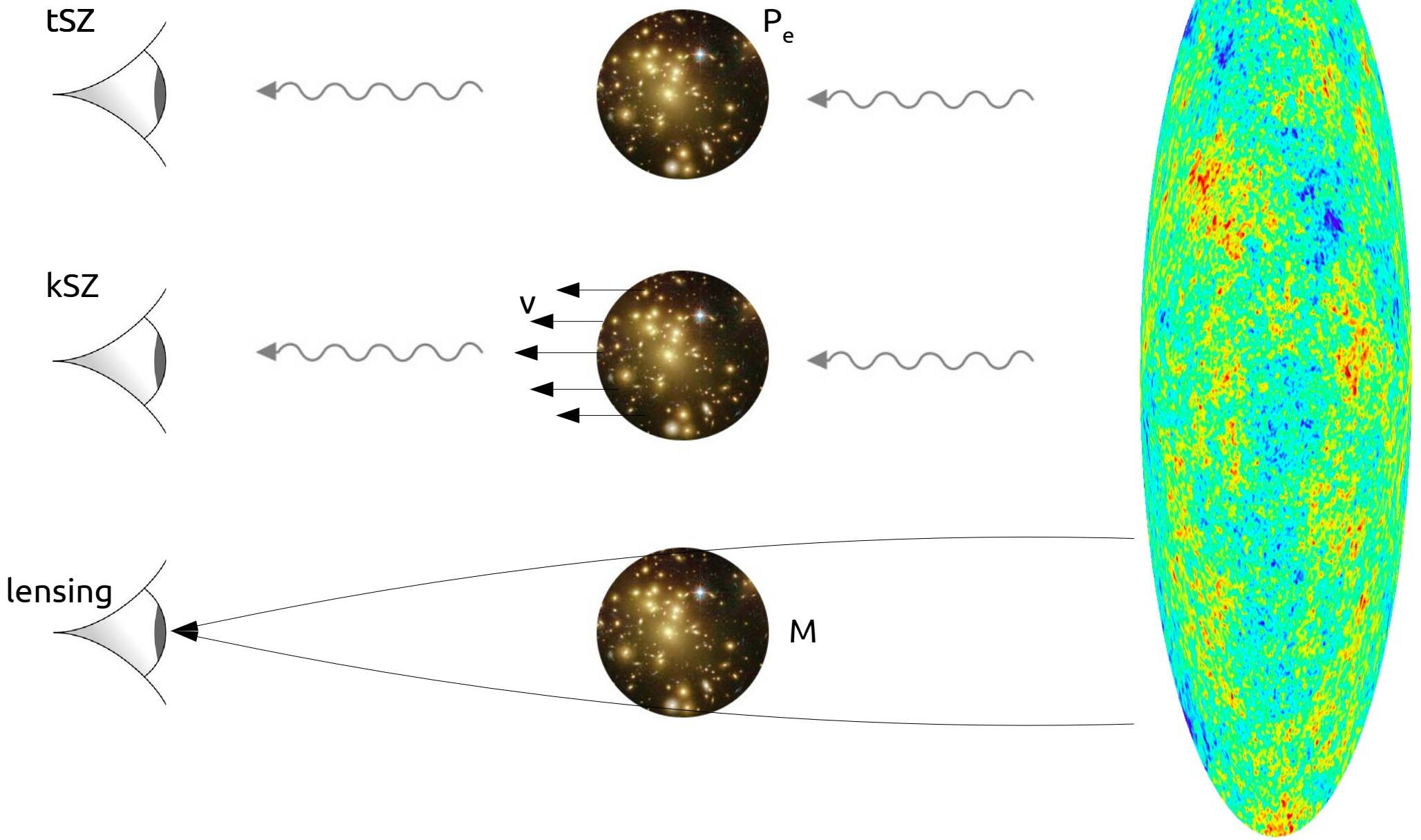


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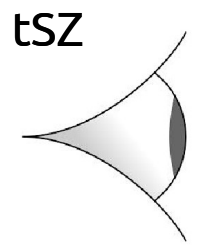


CMB secondary anisotropies

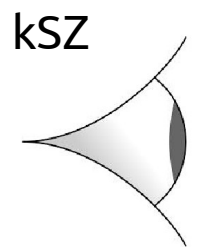
Secondary CMB anisotropies



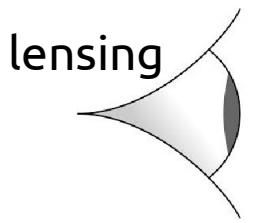
Secondary CMB anisotropies



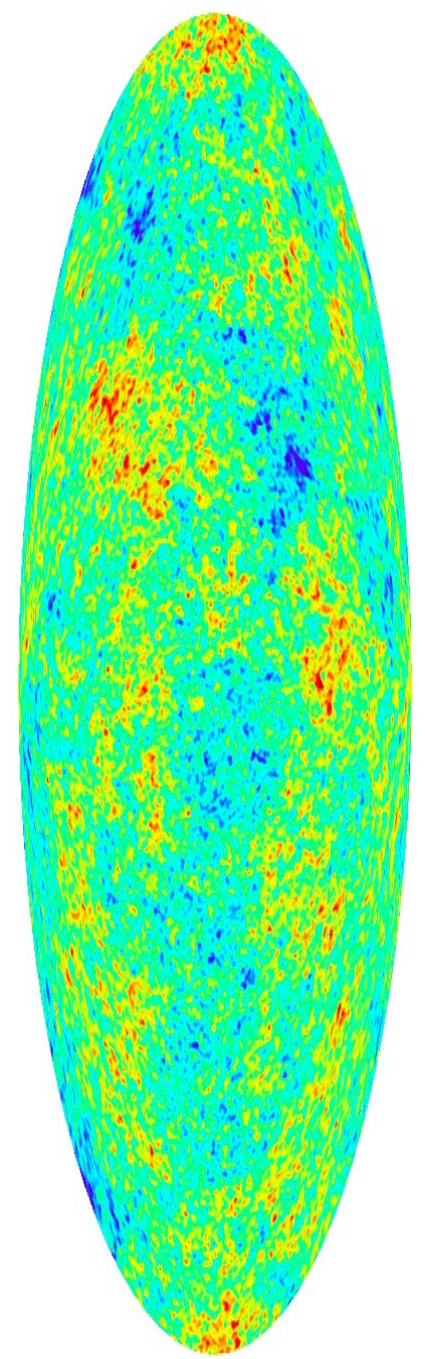
$$\frac{\Delta T}{T} \Big|_{\text{tSZ}}(\nu, \hat{\mathbf{n}}) = f_{\text{tSZ}}(\nu) \frac{\sigma_T}{m_e c^2} \int P_e(l_z, \hat{\mathbf{n}}) dl_z$$
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The Simons Observatory

Simons Observatory

CMB from Chile

- ACT and Simons Array will operate independently through 2018/2019
- Develop and share site infrastructure.
- Significant upgrades (site, telescopes, detectors)
- **Multiple science cases:**
 - Primordial GWs
 - Dark energy
 - Relativistic species
 - Neutrino masses
 - Reionisation
 - Halo thermodynamics
 - Dusty galaxies

SO

Stage 2

1000 detectors
 $\sigma(r) \sim 0.05$
ACTPol, SPTPol, BICEP2

Stage 3

10,000 detectors
 $\sigma(r) \sim 0.006$
AdvACT, SPT3G, SA

Stage 4

500,000 detectors
 $\sigma(r) \sim 0.0005$

2015

2016

2017

2020

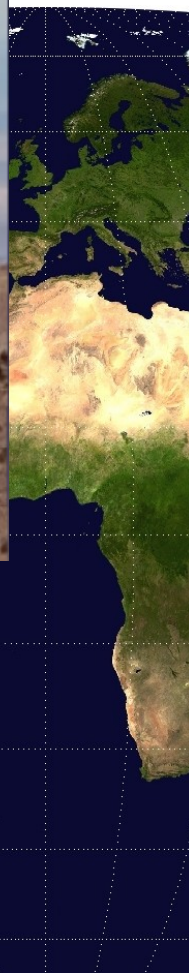
2021

20**

The Simons Observatory

Simons Observatory

Talk to Thibaut!



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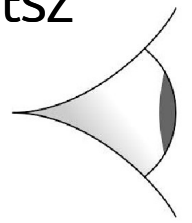
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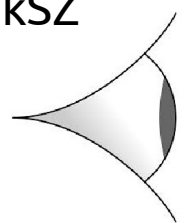
Secondary CMB anisotropies

tSZ



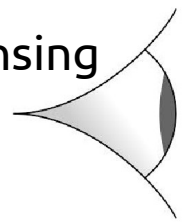
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kSZ

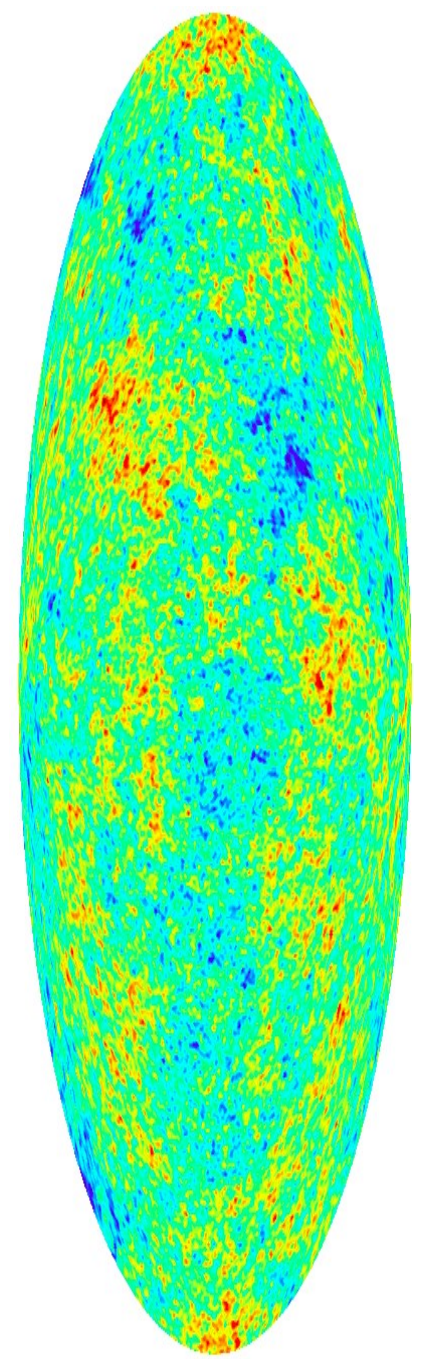


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lensing



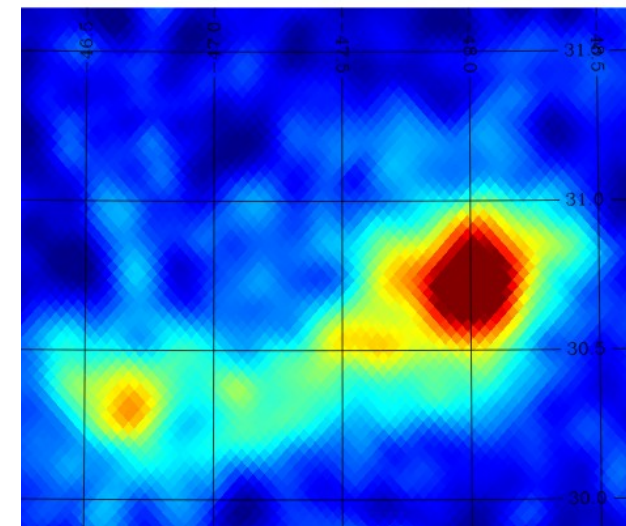
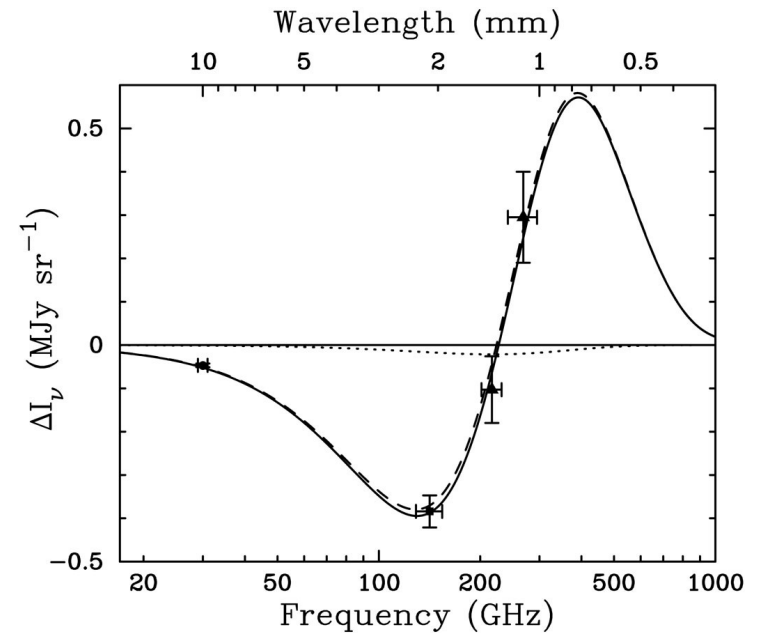
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Thermal Sunyaev-Zel'dovich

Thermal Sunyaev-Zel'Dovich effect

- Scattering of CMB photons off high-energy thermal electrons.
- Characteristic SED \rightarrow separable using multi-frequency.
- Direct tracer of gas pressure.
- Indirect tracer of structure.
- Good mass proxy (tight correlation with halo mass).



Shapley supercluster

Planck Coll et al. 1502.01596

tSZ number counts



1. Find clusters in your data and count them

tSZ number counts

1. Find clusters in your data and count them
2. Associate their mass proxy with a halo mass (MOR).

$$E^{-\beta}(z) \left[\frac{D_A^2(z) \bar{Y}_{500}}{10^{-4} \text{ Mpc}^2} \right] = Y_* \left[\frac{h}{0.7} \right]^{-2+\alpha} \left[\frac{(1-b) M_{500}}{6 \times 10^{14} M_\odot} \right]^\alpha$$

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3. Calibrate MOR with external data (lensing, X-ray)

tSZ number counts

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2. Associate their mass proxy with a halo mass (MOR).

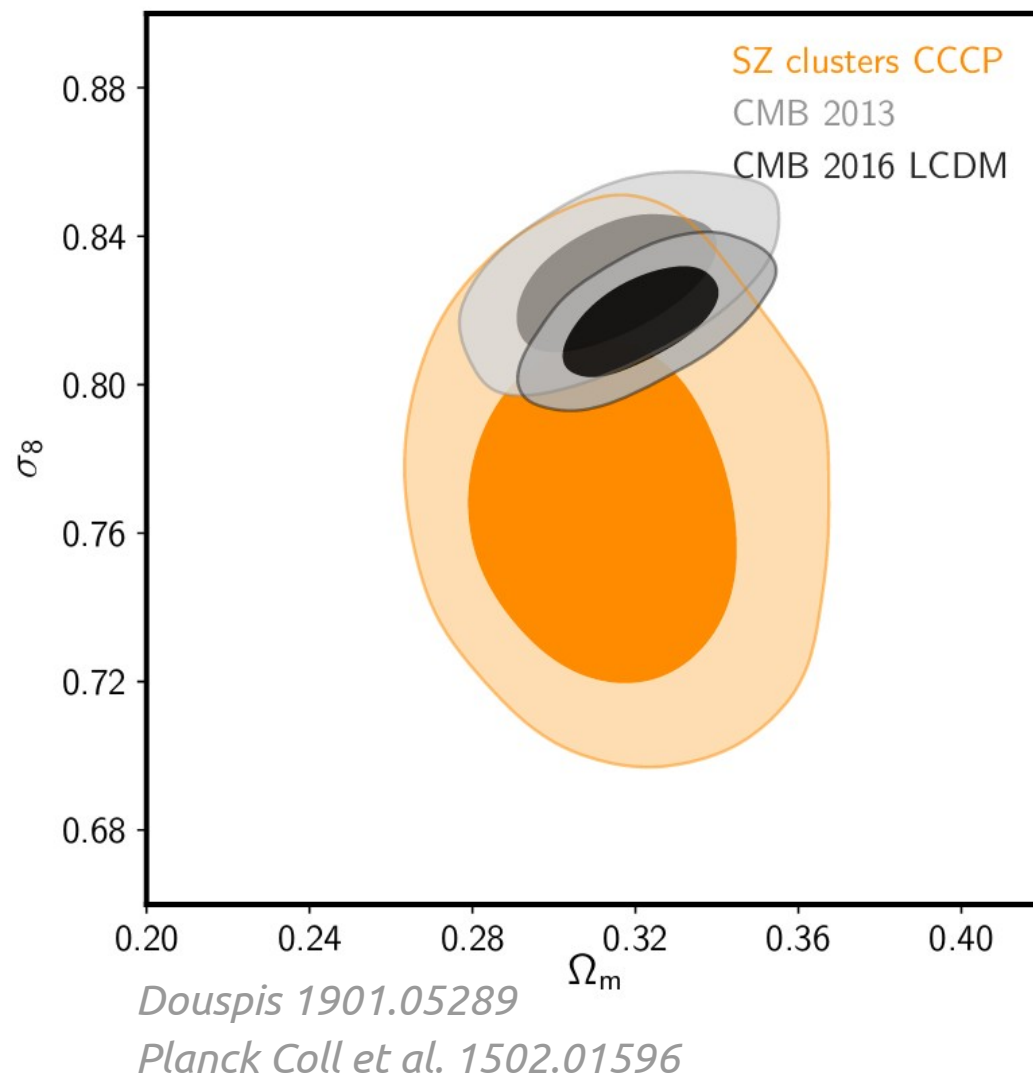
$$E^{-\beta}(z) \left[\frac{D_A^2(z) \bar{Y}_{500}}{10^{-4} \text{ Mpc}^2} \right] = Y_* \left[\frac{h}{0.7} \right]^{-2+\alpha} \left[\frac{(1-b) M_{500}}{6 \times 10^{14} M_\odot} \right]^\alpha$$

3. Calibrate MOR with external data (lensing, X-ray)
4. Compare abundance with prediction from simulations/theory.

Current tensions: the amplitude of fluctuations from clusters

Cluster cosmology:

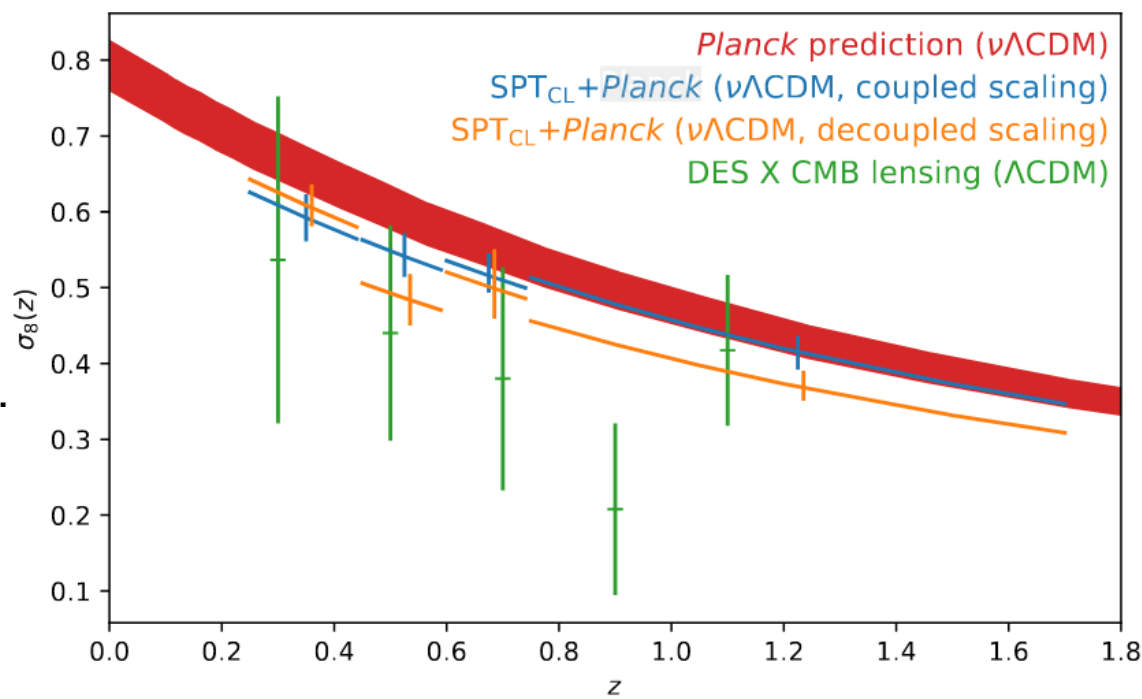
- Imagine you had an estimate of the mass for some clusters.
- Their distribution is predicted by the mass function.
- Use the distribution to infer cosmology.
- ...
- However, you don't know the mass, only observable proxies of it.
- So first calibrate mass-observable relation.
- Then marginalize over all necessary nuisance parameters.
- Example: SZ-selected clusters.
- $\sim 2.4\sigma$ deviation for Planck data.



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(similar result in SPT data)

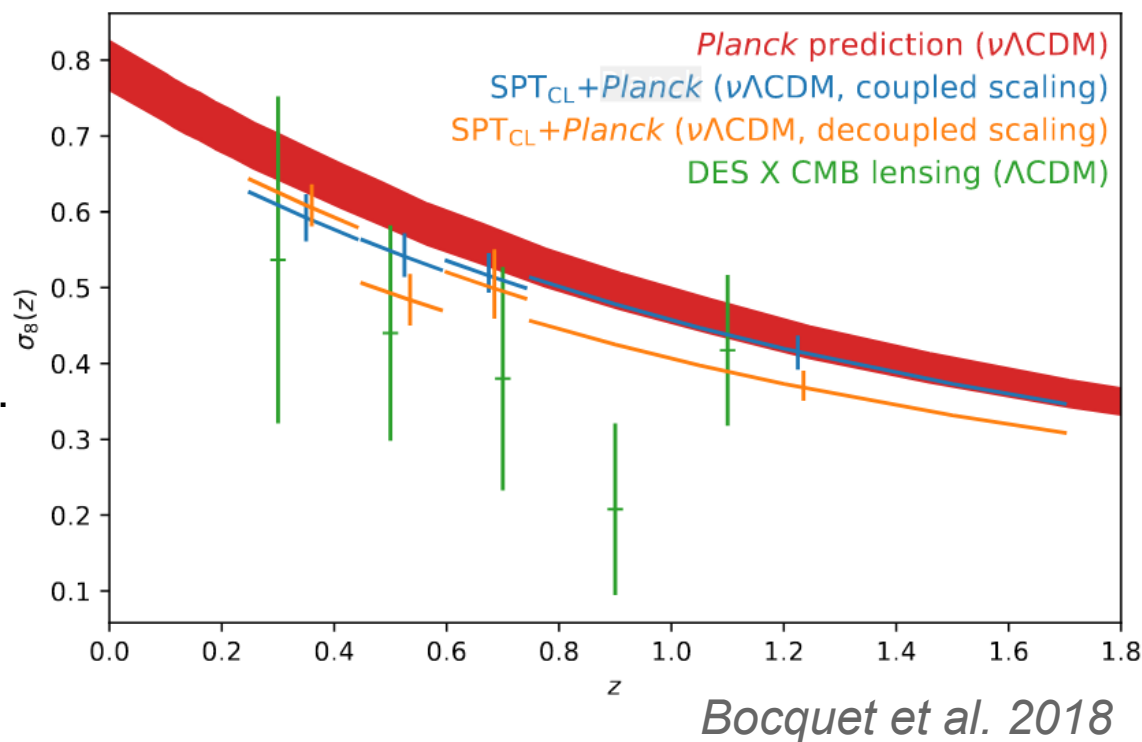


Bocquet et al. 2018

Current tensions: the amplitude of fluctuations from clusters

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- Then marginalize over all necessary nuisance parameters.
- Example: SZ-selected clusters.
- $\sim 2.4\sigma$ deviation for Planck data.
(similar result in SPT data)
(in the same direction as weak lensing!)
(similar claims with redshift-space dist.)



SZ challenges: mass calibration

$$E^{-\beta}(z) \left[\frac{D_A^2(z) \bar{Y}_{500}}{10^{-4} \text{ Mpc}^2} \right] = Y_* \left[\frac{h}{0.7} \right]^{-2+\alpha} \left[\frac{(1-b) M_{500}}{6 \times 10^{14} M_\odot} \right]^\alpha$$

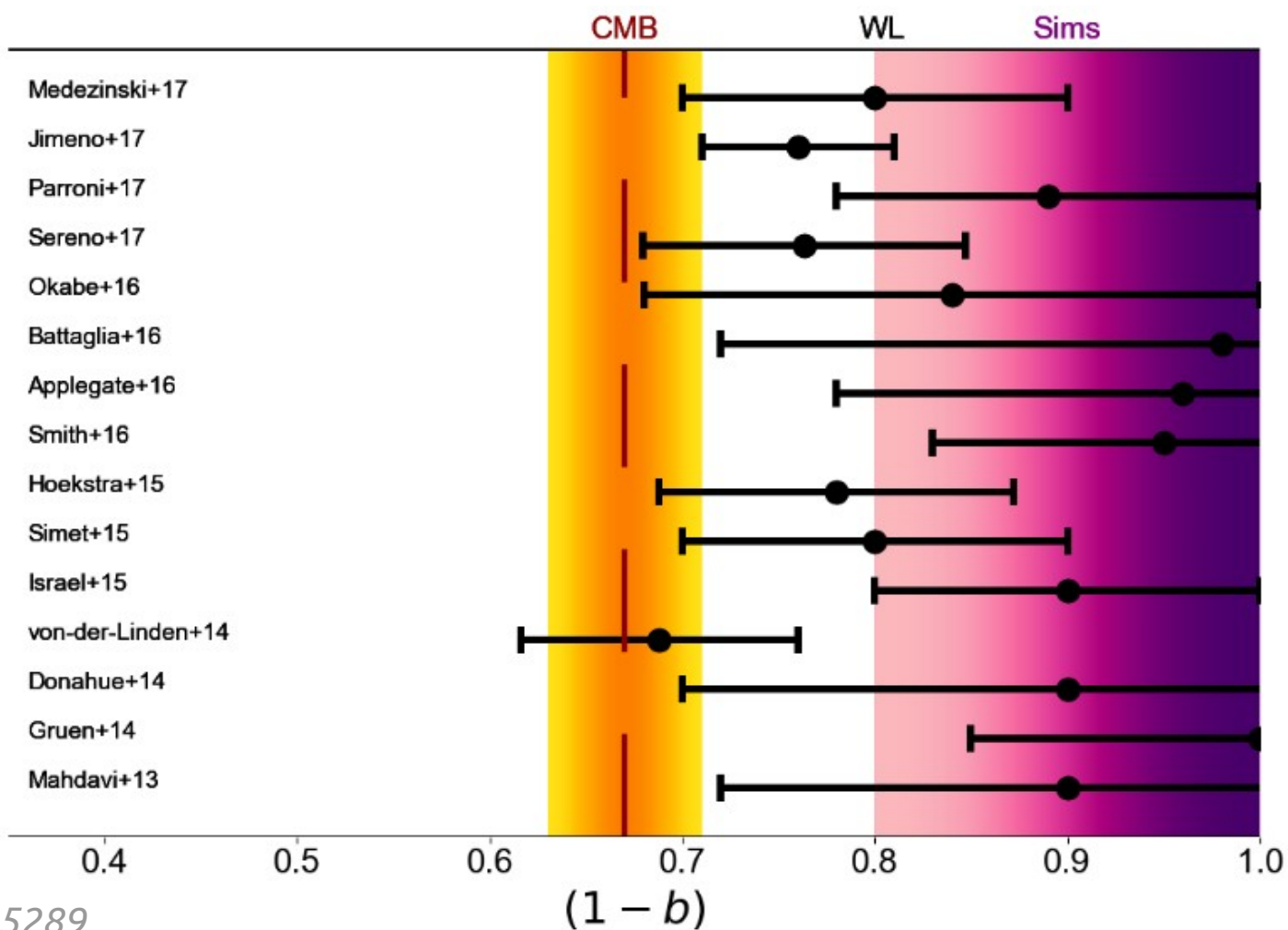
Planck Coll et al. 1502.01596

How much mass are we missing in X-ray observations?

SZ challenges: mass calibration

$$E^{-\beta}(z) \left[\frac{D_A^2(z) \bar{Y}_{500}}{10^{-4} \text{ Mpc}^2} \right] = Y_* \left[\frac{h}{0.7} \right]^{-2+\alpha} \left[\frac{(1-b) M_{500}}{6 \times 10^{14} M_\odot} \right]^\alpha$$

Planck Coll et al. 1502.01596



Douspis 1901.05289

Calibrating SZ masses with CMB lensing

Calibrating masses with CMB lensing

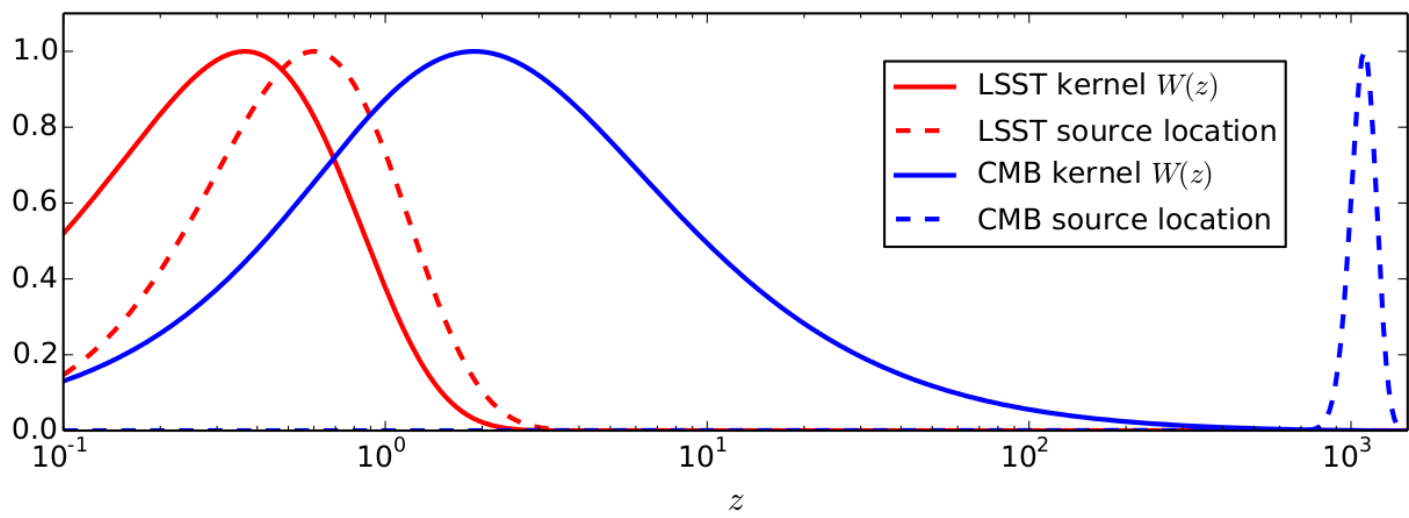
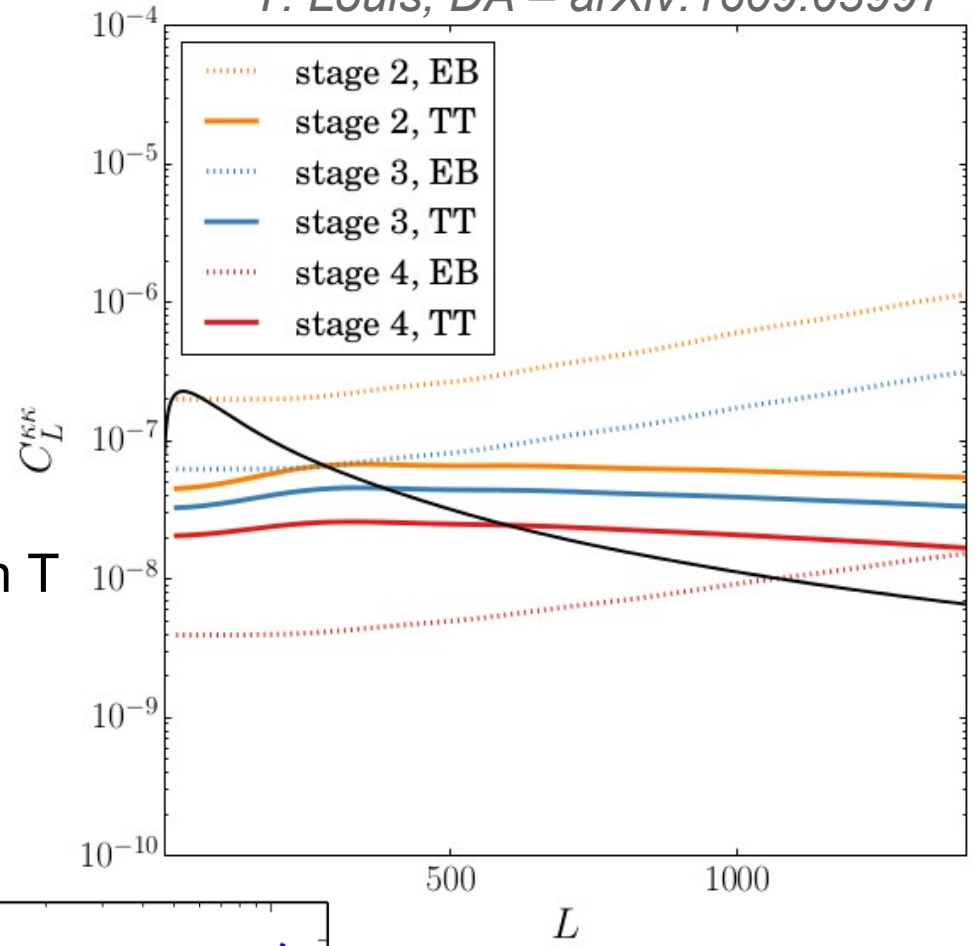
Main complication: tSZ $Y_{500} \leftrightarrow$ halo mass

Options:

- X-ray
- Weak galaxy lensing
 - x Lensing systematics?
 - x High z?
- CMB lensing?
 - ✓ Potentially better systematics
 - ✓ With S4, better lensing noise with P than T (more robust against foregrounds)

Melin et al. 2015
S4 collaboration – arXiv:1610.02743
Madhavacheril et al. 2017

T. Louis, DA – arXiv:1609.03997



Calibrating SZ masses with CMB lensing

T. Louis, DA – arXiv:1609.03997

Calibrating masses with CMB lensing

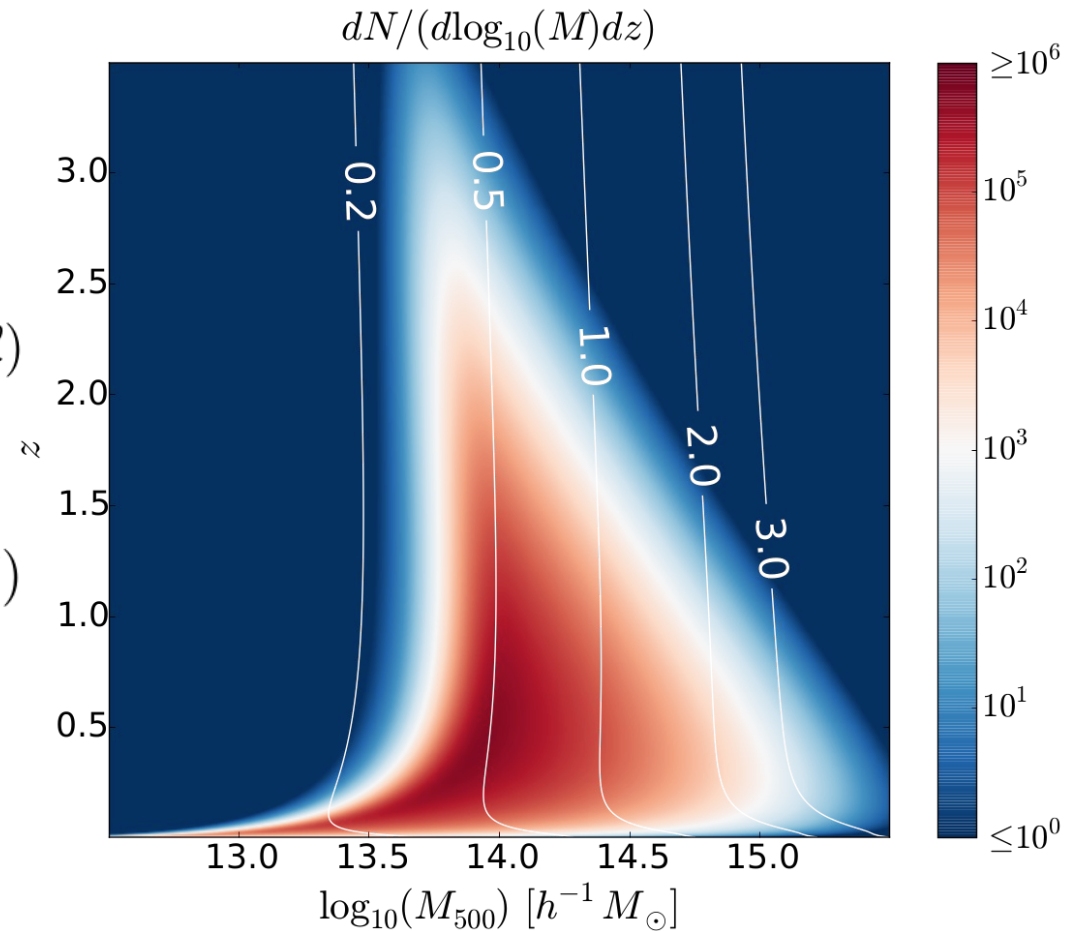
Method:

- Find clusters in temperature map from tSZ
- Reconstruct lensing convergence from polarization
- Estimate cluster mass and Compton-Y using matched filter approach in either map

$$\kappa(\mathbf{x}) = U_{\kappa}(\mathbf{x})\kappa_{5\theta_{500}} + n_{\kappa}(\mathbf{x})$$

$$\hat{\kappa}_{5\theta_{500}} = \sigma^2(\hat{\kappa}_{5\theta_{500}}) \int d\ell U_{\kappa}^T(\ell) N_{\kappa\kappa}^{-1}(\ell) \kappa(\ell)$$

$$\sigma^{-2}(\hat{\kappa}_{5\theta_{500}}) = \int d\ell U_{\kappa}^T(\ell) N_{\kappa\kappa}^{-1}(\ell) U_{\kappa}(\ell)$$

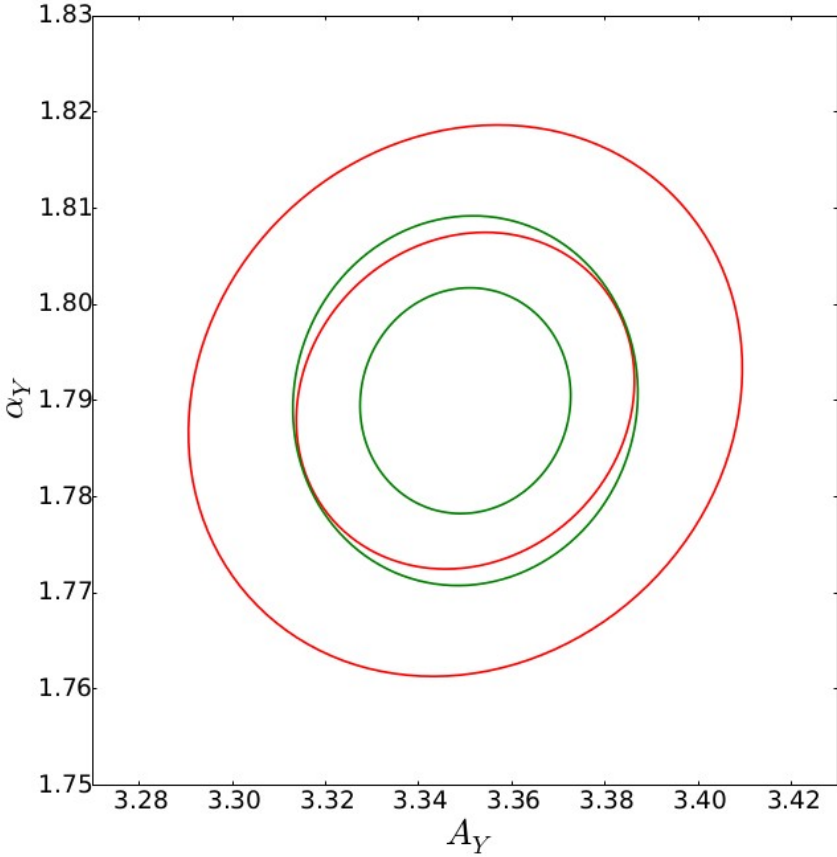


Calibrating SZ masses with CMB lensing

T. Louis, DA – arXiv:1609.03997

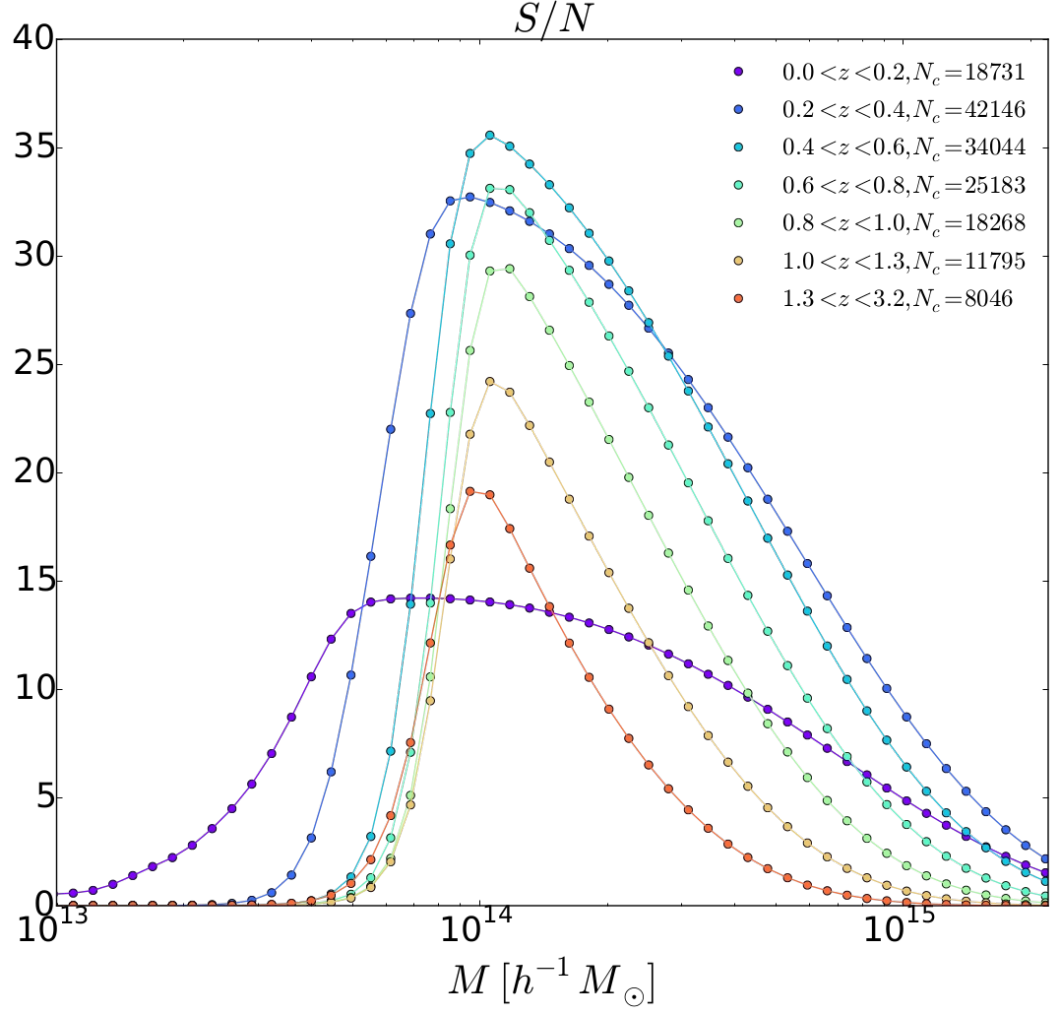
Mass calibration forecasts

Parametric



~0.4% measurement of (1-b)

Non-parametric



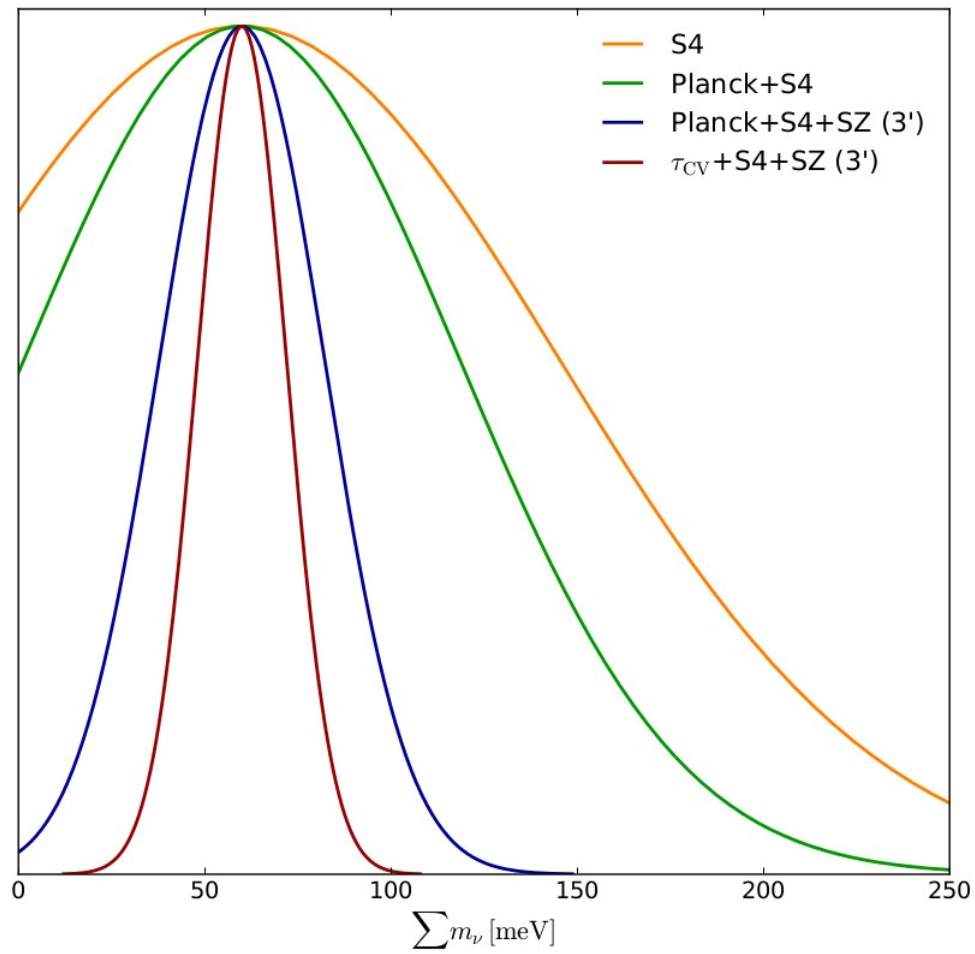
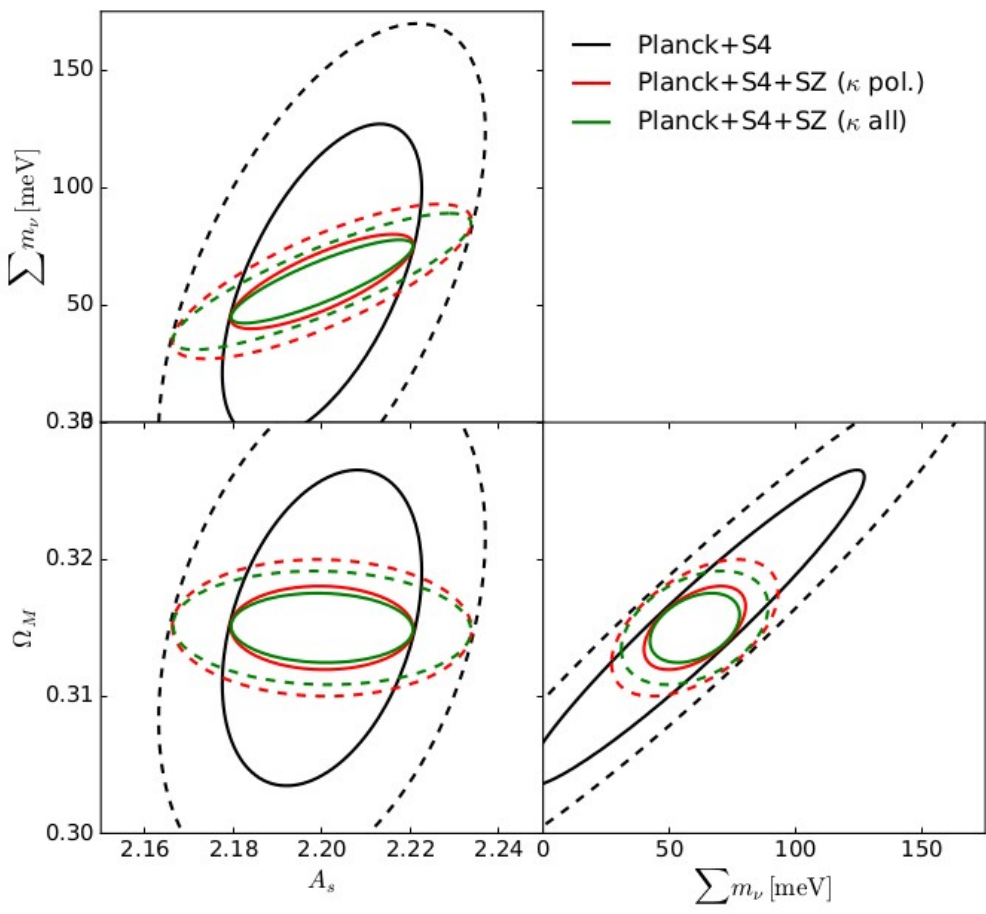
Calibrating SZ masses with CMB lensing

T. Louis, DA – arXiv:1609.03997

Connection with cosmological parameters

Joint tSZ+lensing likelihood
3-5 σ measurement of neutrino mass

$$\frac{N(q, M_L, z)}{\Delta q_Y \Delta M_L \Delta z} \equiv \int dM dY \frac{d^3 N}{dz dM dY} P(q_Y, M_L | Y, M)$$



Mapping the tSZ effect

There is gas everywhere!

- We can estimate the tSZ flux at every pixel (not just in clusters).
- This will make us sensitive to sources below the detection level and diffuse components.
- Ideal to study warm gas and its correlation with other density tracers.

Internal Linear Combination (ILC):

tSZ has a well-known, universal SED (+ small relativistic effects).

Find the linear combination of all your frequency maps that:

- Leaves the tSZ contribution untouched.
- Minimizes the variance of the final map.

State-of-the-art methods implement further bells and whistles:

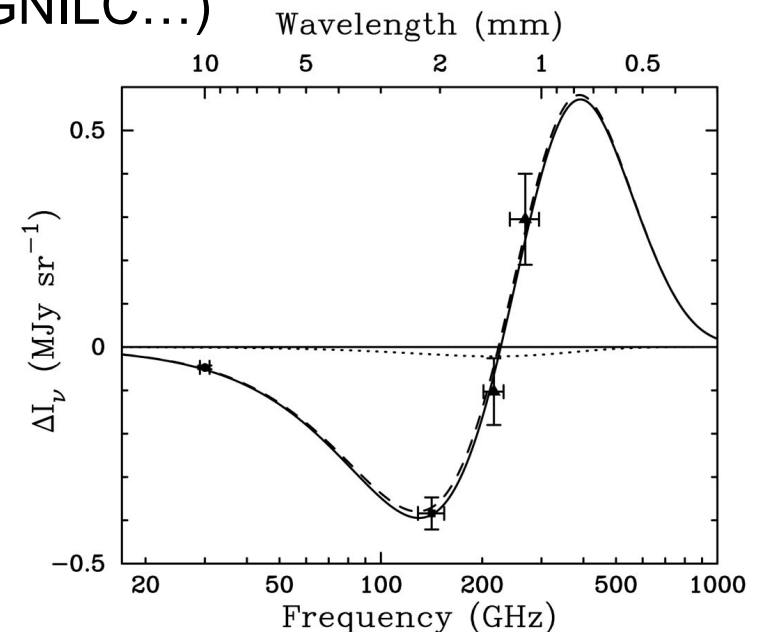
- Position- and scale-dependent ILCs (MILCA, NILC, GNILC...)
- Deprojection of contaminants with known SEDs

Eriksen et al. 2004

Hurier et al. 2010

Delabrouille et al. 2009

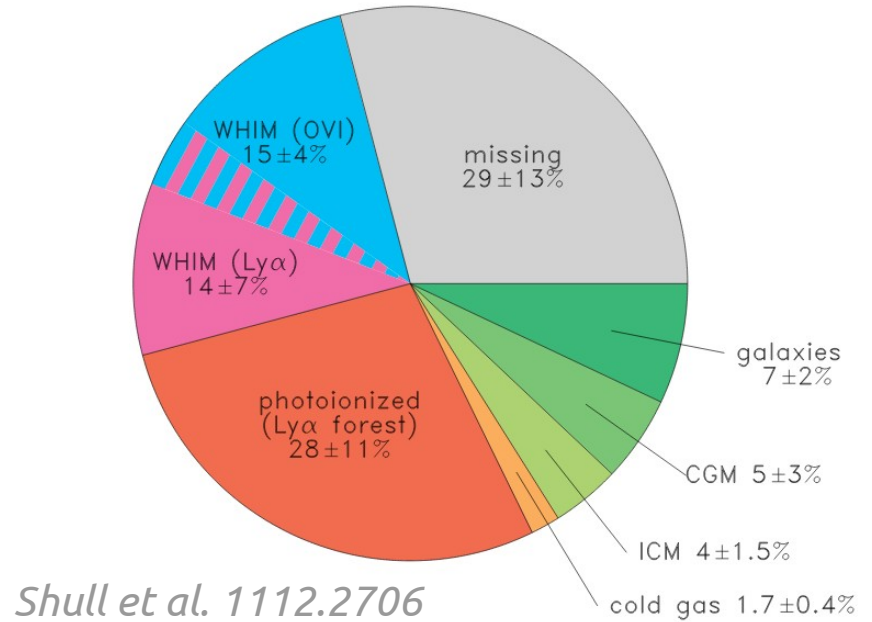
Remazeilles et al. 2011a,b



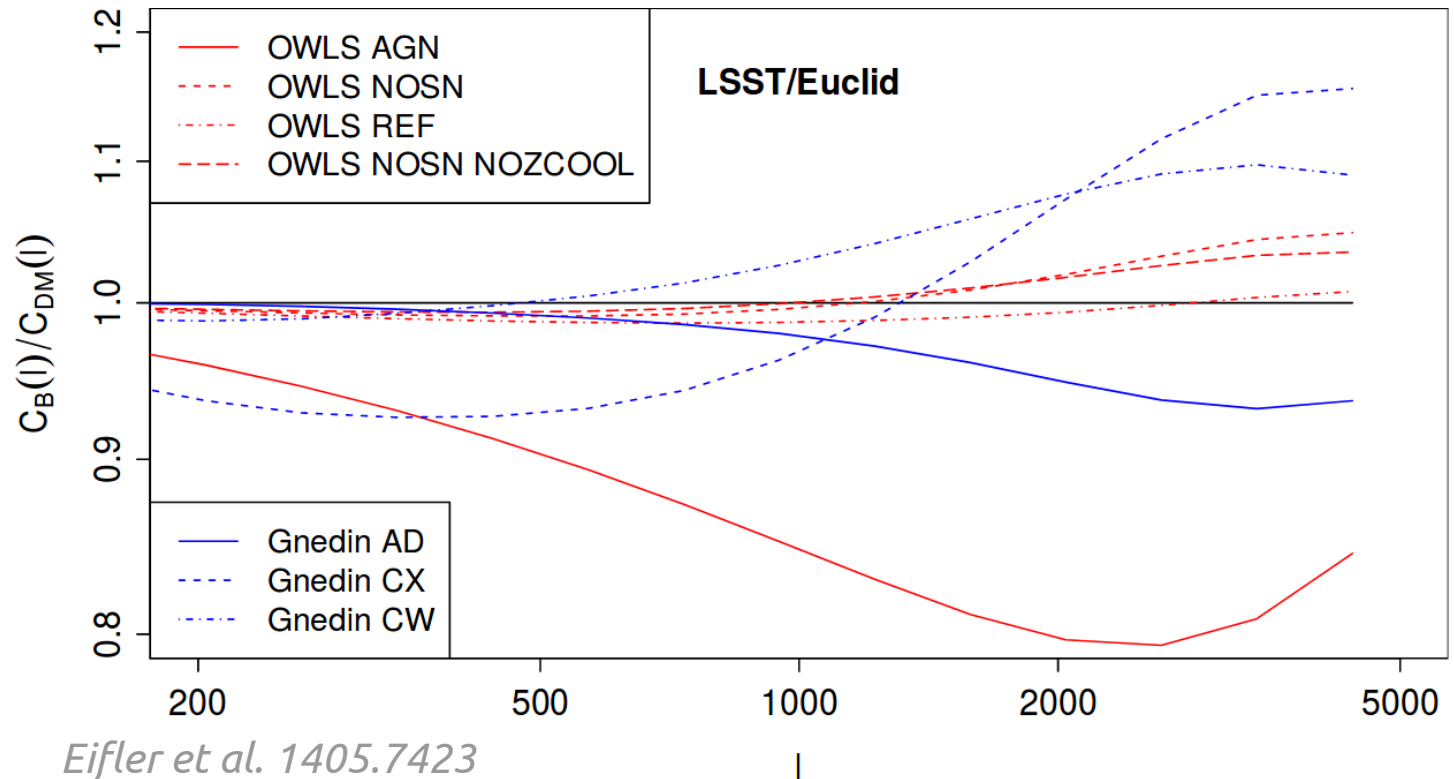
Measuring gas properties

Why study gas?

1. Baryonic effects are a poorly-understood systematic for measurements of the matter power spectrum.
2. We don't have a good understanding of the diffuse gas distribution and thermodynamics ("missing baryons").
3. Uncertain temperature-density relation (e.g. Ly α systematics)
4. Cluster mass uncertainties leak directly into cosmology.



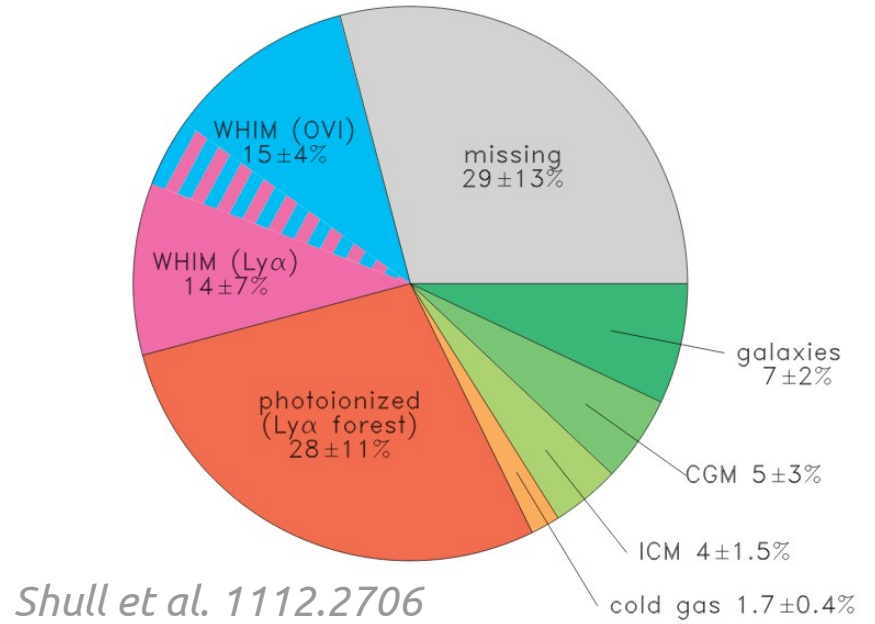
Bregman 0706.1787
Planck et al. 1504.03339
Hill et al. 1603.01608
Hill & Spergel 1312.4525
Hernandez-Monteagudo et al. 1504.04011



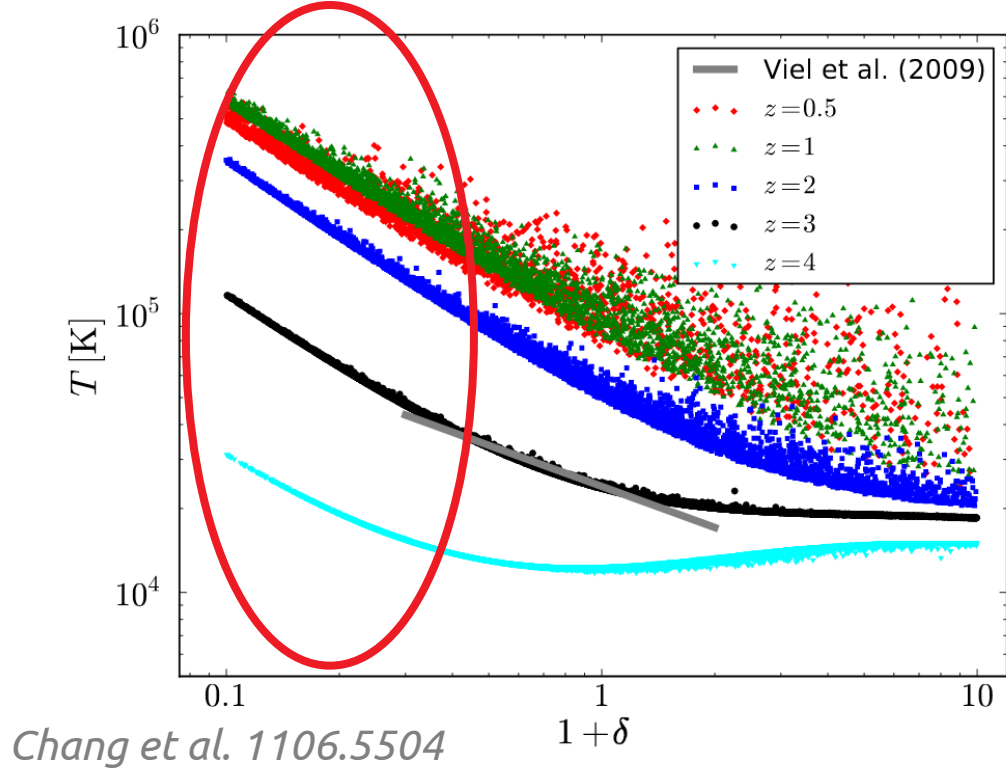
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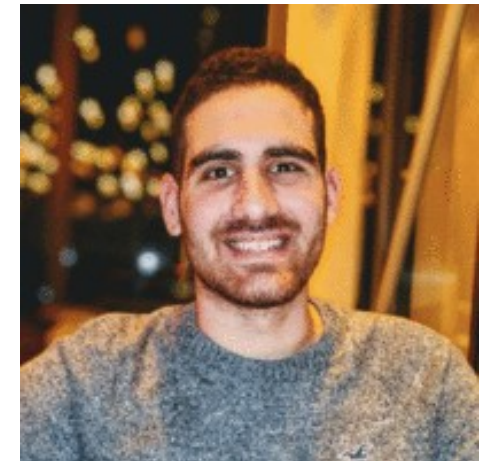
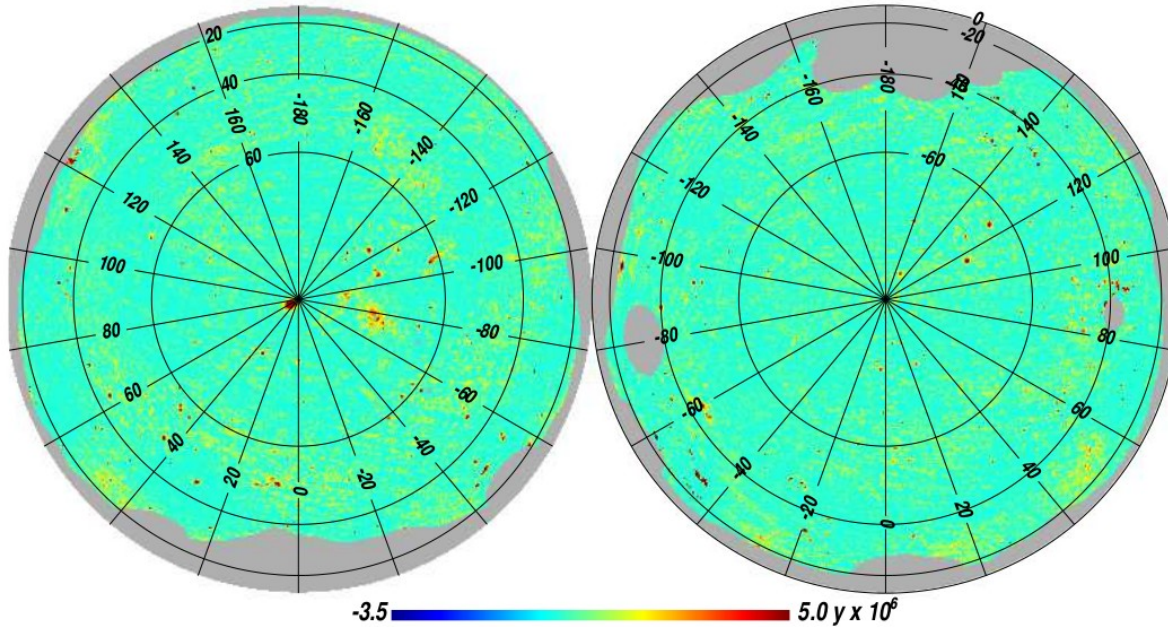
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Cross-correlation with galaxy clustering

$$y \propto (1 - b_H)^\alpha \quad \delta_g \propto b_g$$

MILCA tSZ map



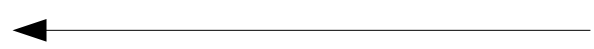
Nick Koukoufilippas

Cross-correlation with galaxy clustering

$$y \propto (1 - b_H)^\alpha$$

$$\delta_g \propto b_g$$

$$C_\ell^{gg} \propto b_g^2$$



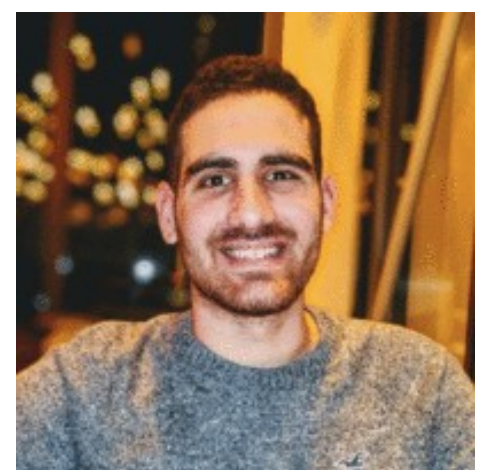
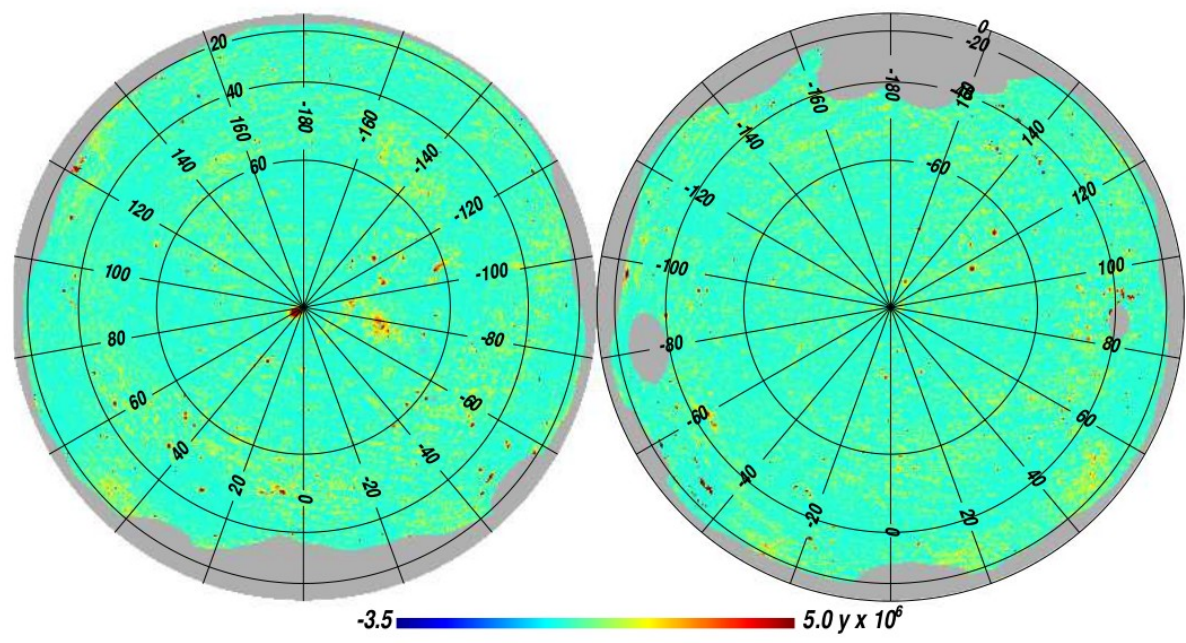
Measure galaxy bias.

$$C_\ell^{gy} \propto b_g(1 - b_H)$$



Use it to measure hydrostatic bias

MILCA tSZ map



Nick Koukoufilippas

Potential to also constrain y - λ relation.

SZ challenges: cross-correlation with galaxy clustering

$$y \propto (1 - b_H)^\alpha$$

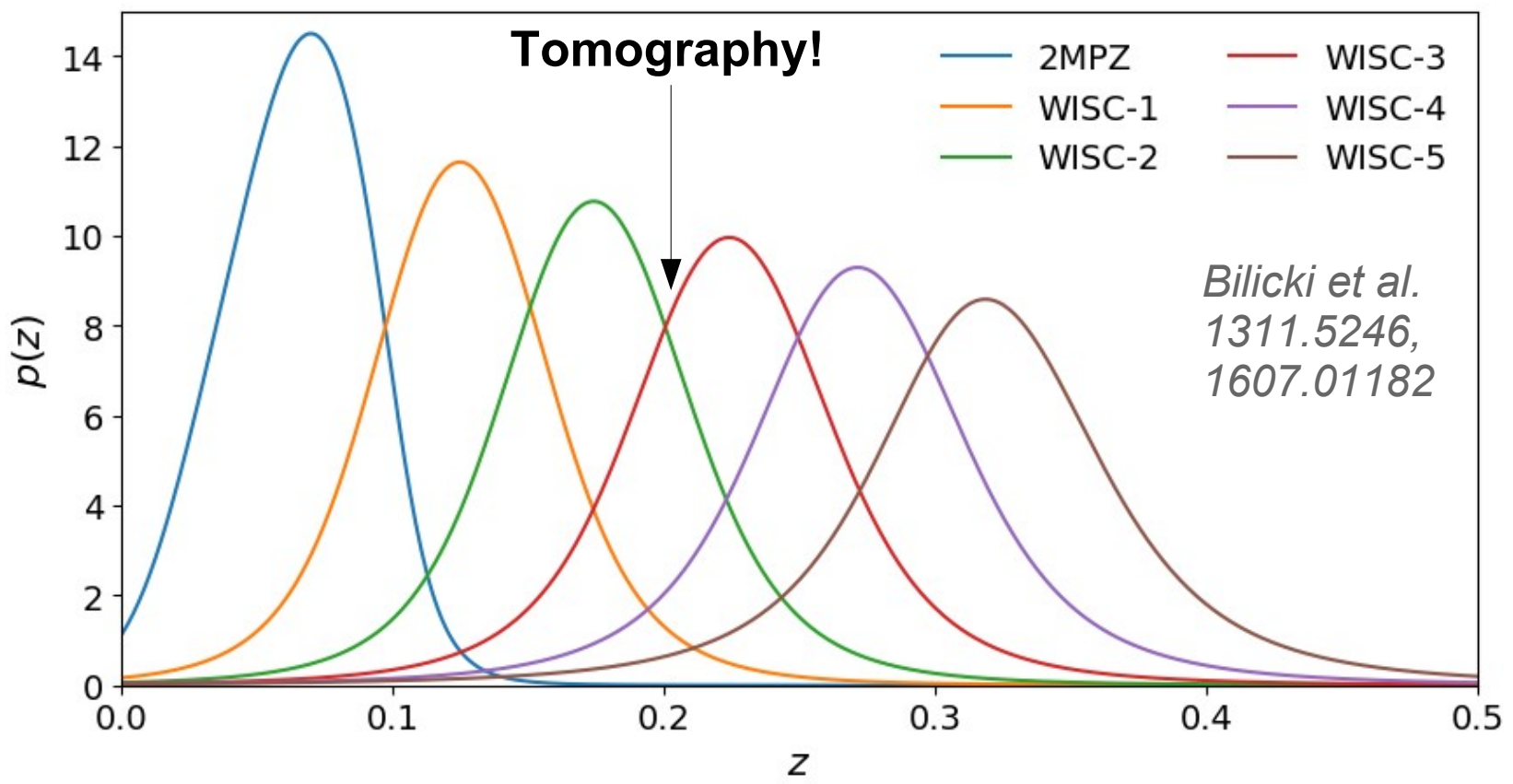
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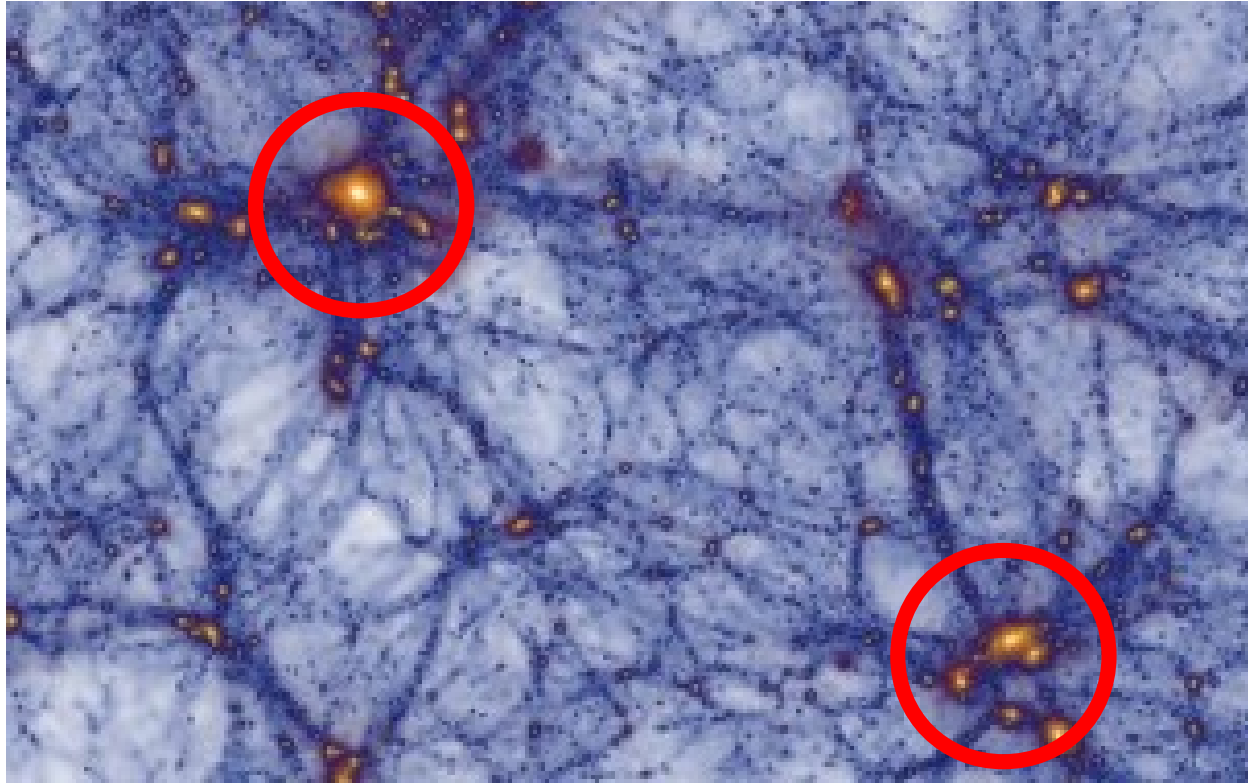
← Measure galaxy bias.

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← Use it to measure hydrostatic bias

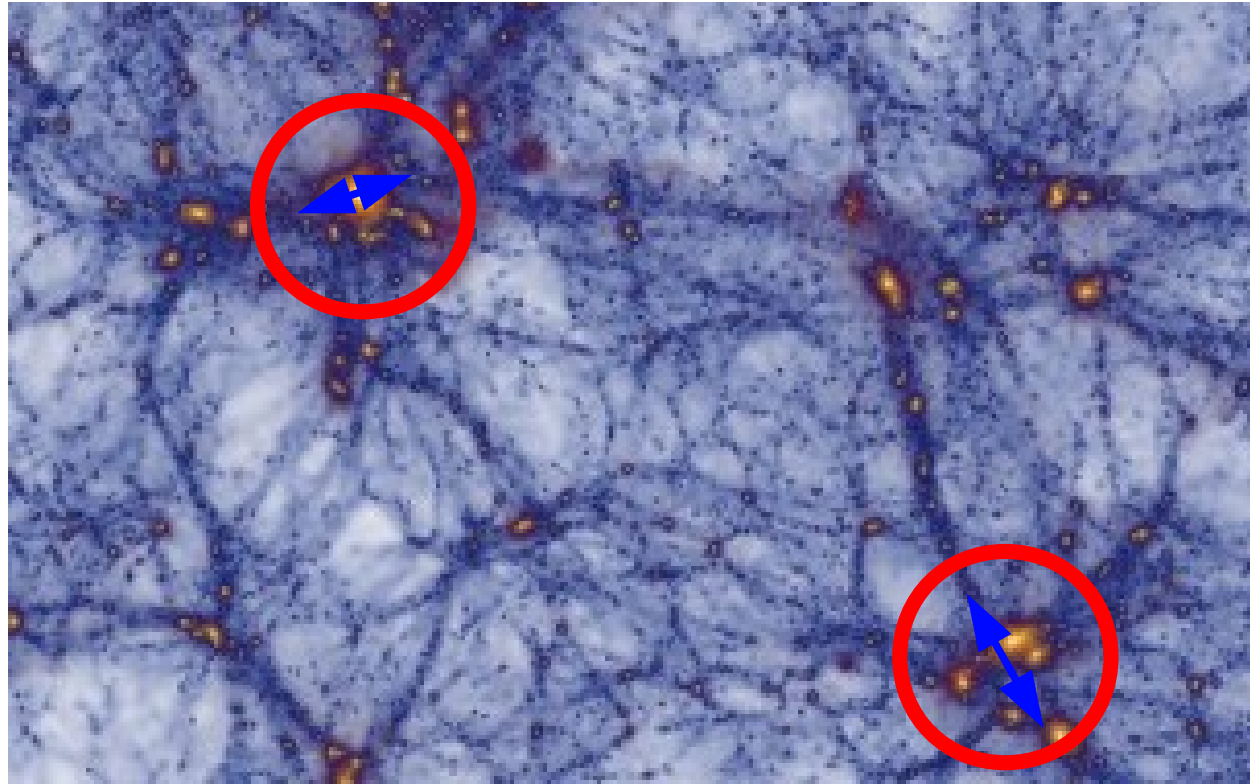


Halo-model prediction



Halo-model prediction

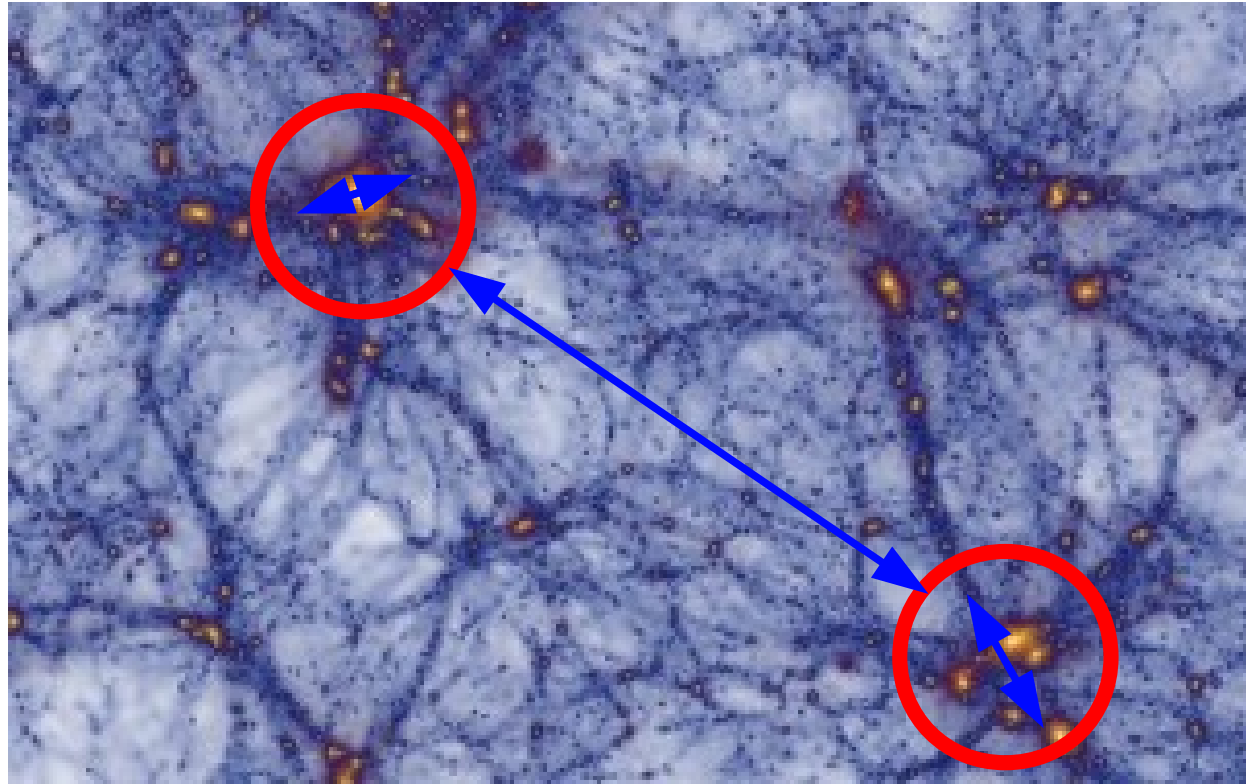
$$P_{UV}(k) = P_{UV}^{1h}(k) + P_{UV}^{2h}(k)$$



$$P_{UV}^{1h}(k) = \int dM \frac{dn}{dM} \langle U(k|M) V(k|M) \rangle$$

Halo-model prediction

$$P_{UV}(k) = P_{UV}^{1h}(k) + P_{UV}^{2h}(k)$$



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$$P_{UV}^{2h}(k) = P_L(k) \left[\int dM \frac{dn}{dM} b_h(M) \langle U(k|M) \rangle \right] \left[\int dM \frac{dn}{dM} b_h(M) \langle V(k|M) \rangle \right]$$

Modelling the y-g cross-correlation:

- g: Halo Occupation Distribution (HOD).

Model number of central/satellite galaxies (and their statistics) as a function of M_h .

$$\langle N_c(M) \rangle = \frac{1}{2} \left[1 + \operatorname{erf} \left(\frac{\log(M/M_{\min})}{\sigma_{\ln M}} \right) \right]$$

$$\langle N_s(M) \rangle = \Theta(M - M_0) \left(\frac{M - M_0}{M'_1} \right)^{\alpha_s}$$

Halo-model prediction

Modelling the y-g cross-correlation:

- g: Halo Occupation Distribution (HOD).
Model number of central/satellite galaxies (and their statistics) as a function of M_h .
- y: generalized NFW profile (Arnaud et al. 2010).
($1-b_H$) as free parameter.

$$P_e(r) = P_* p(r/r_{500c}) \quad p(x) = (c_{500}x)^{-\gamma} [1 + (c_{500}x)^\alpha]^{(\gamma-\beta)/\alpha}$$

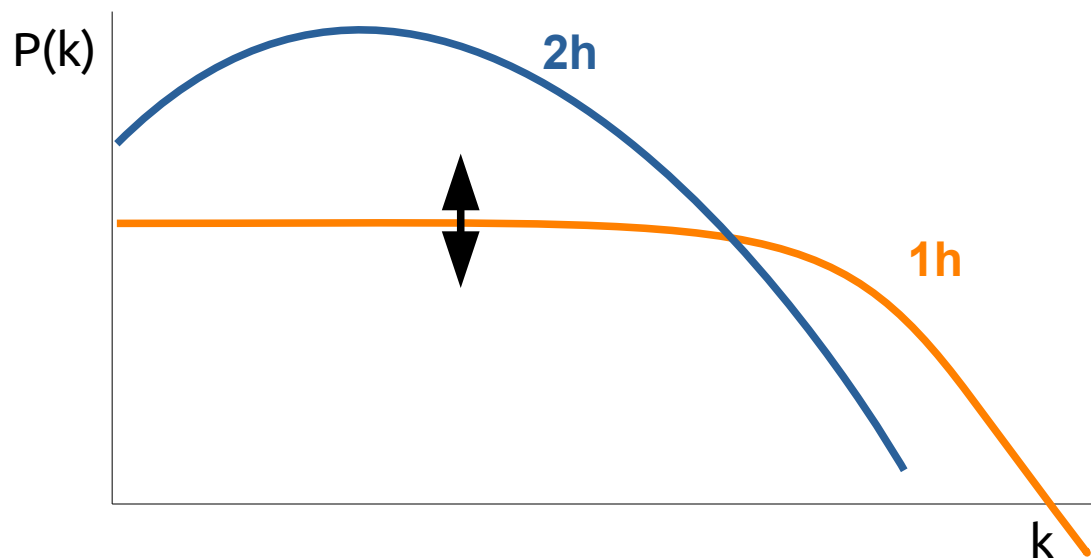
$$P_* = 6.41 (1.65\text{eV cm}^{-3}) \left(\frac{h}{0.7}\right)^{8/3} \left(\frac{(h/0.7)(1-b)M_{500c}}{3 \times 10^{14}M_\odot}\right)^{2/3+0.12}$$

Halo-model prediction

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- y: generalized NFW profile (Arnaud et al. 2010).
($1-b_H$) as free parameter.
- yxg 1-halo scatter modelled through extra parameter ρ_{yg}
Controls amplitude of 1-halo term. Degenerate with $1-b_H$ there.
Effectively nullifies any information we can get from the 1-halo term.

$$\langle u_g(k) u_y(k) \rangle = (1 + \rho_{yg}) \langle u_g(k) \rangle \langle u_y(k) \rangle$$

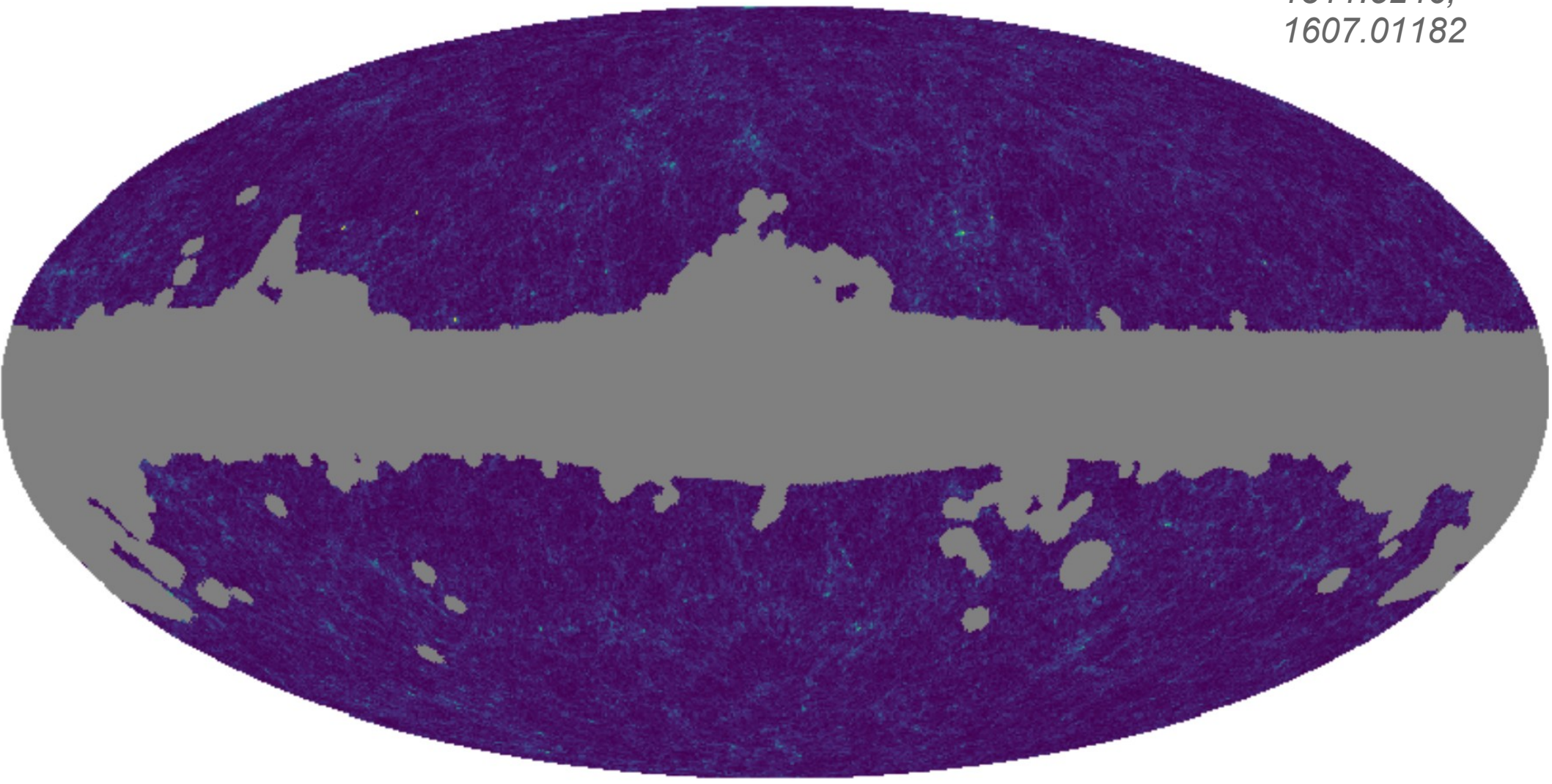


Data

Datasets:

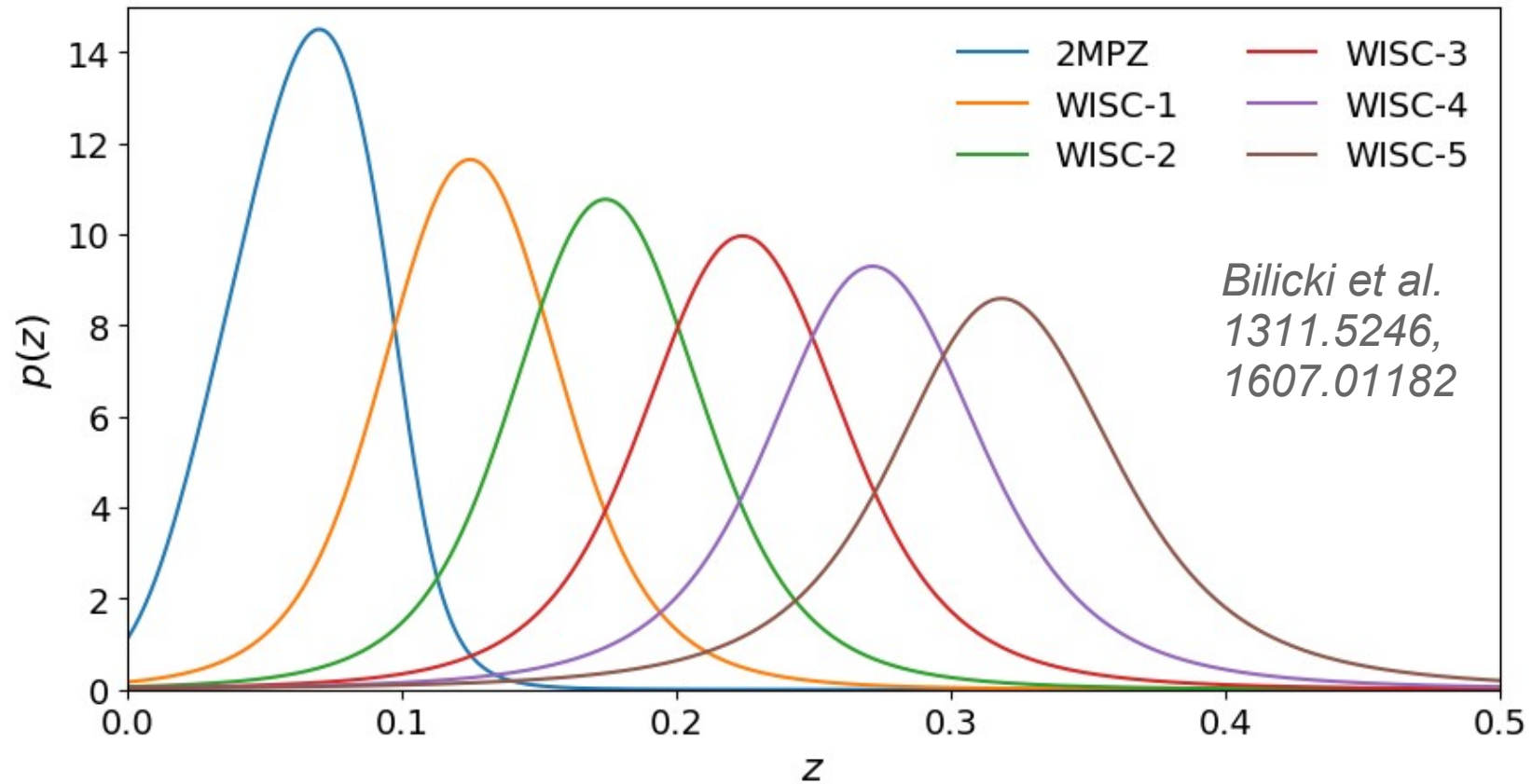
- y: Planck maps (MILCA and NILC) *Aghanim et al. 2015*
- g: 2MPZ (2MASS + WISE + SuperCosmos, low-redshift), WISC (WISE + SuperCOSMOS, higher redshift). Full sky, photometric redshifts.

Bilicki et al.
1311.5246,
1607.01182

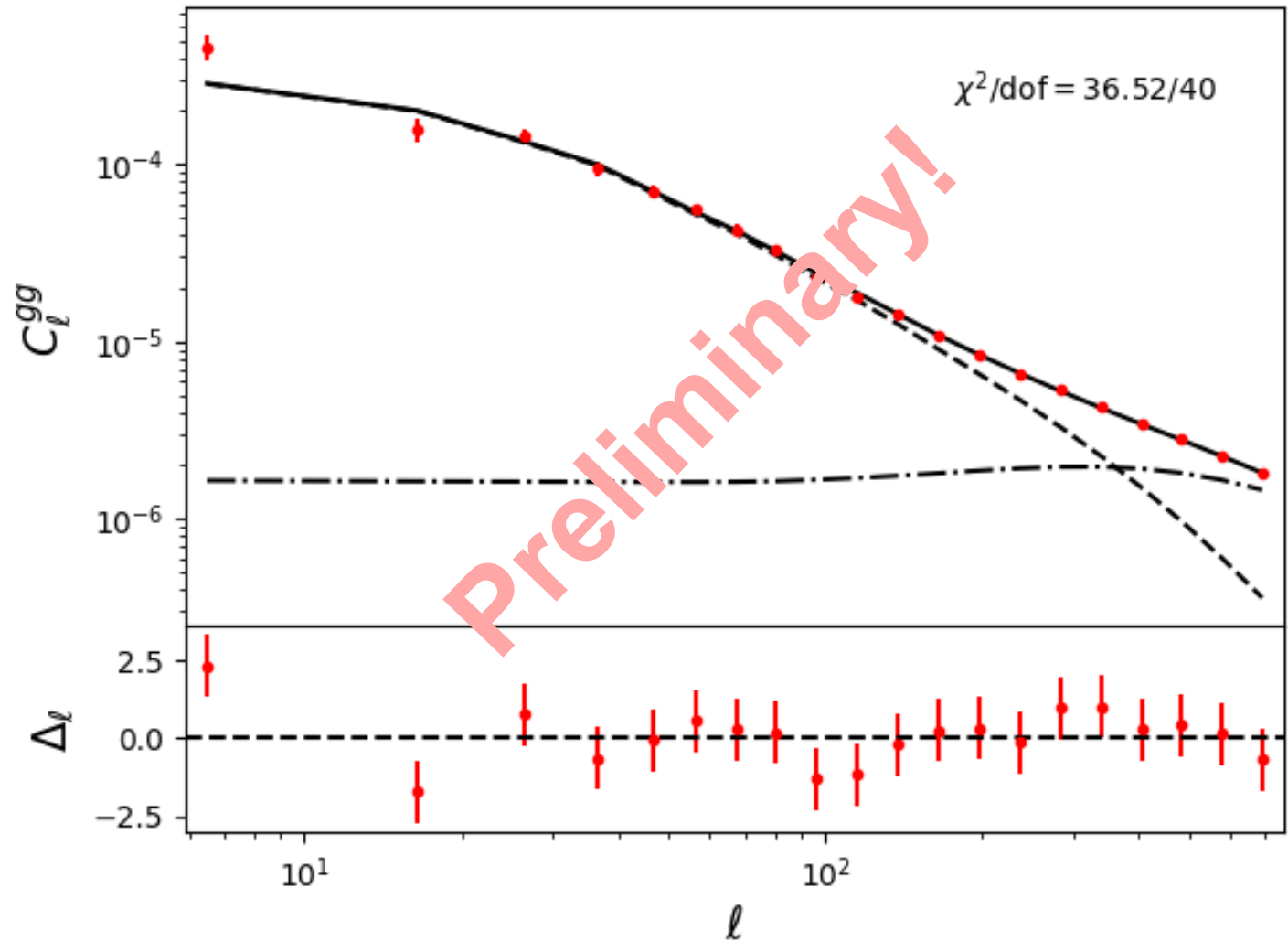


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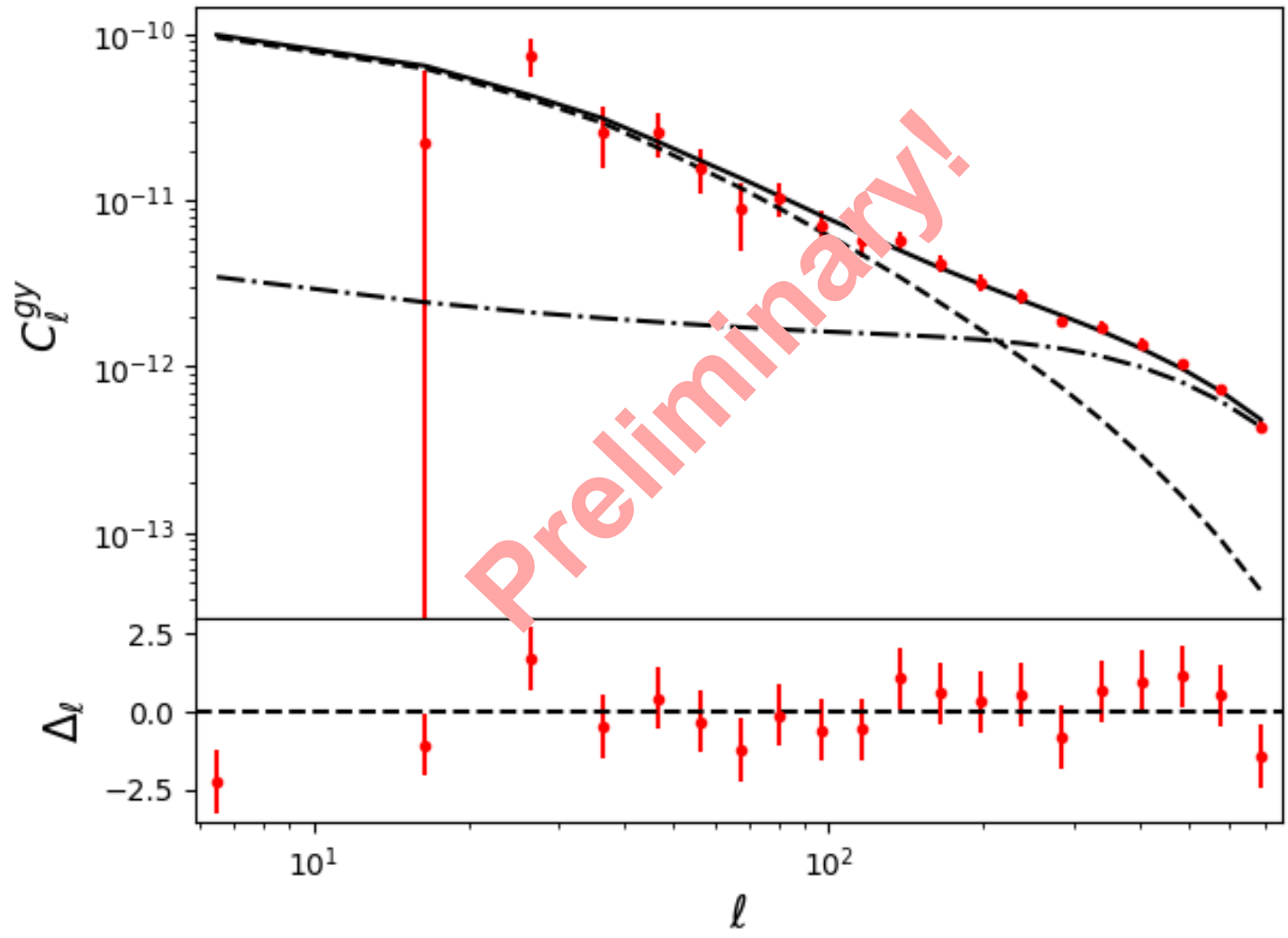
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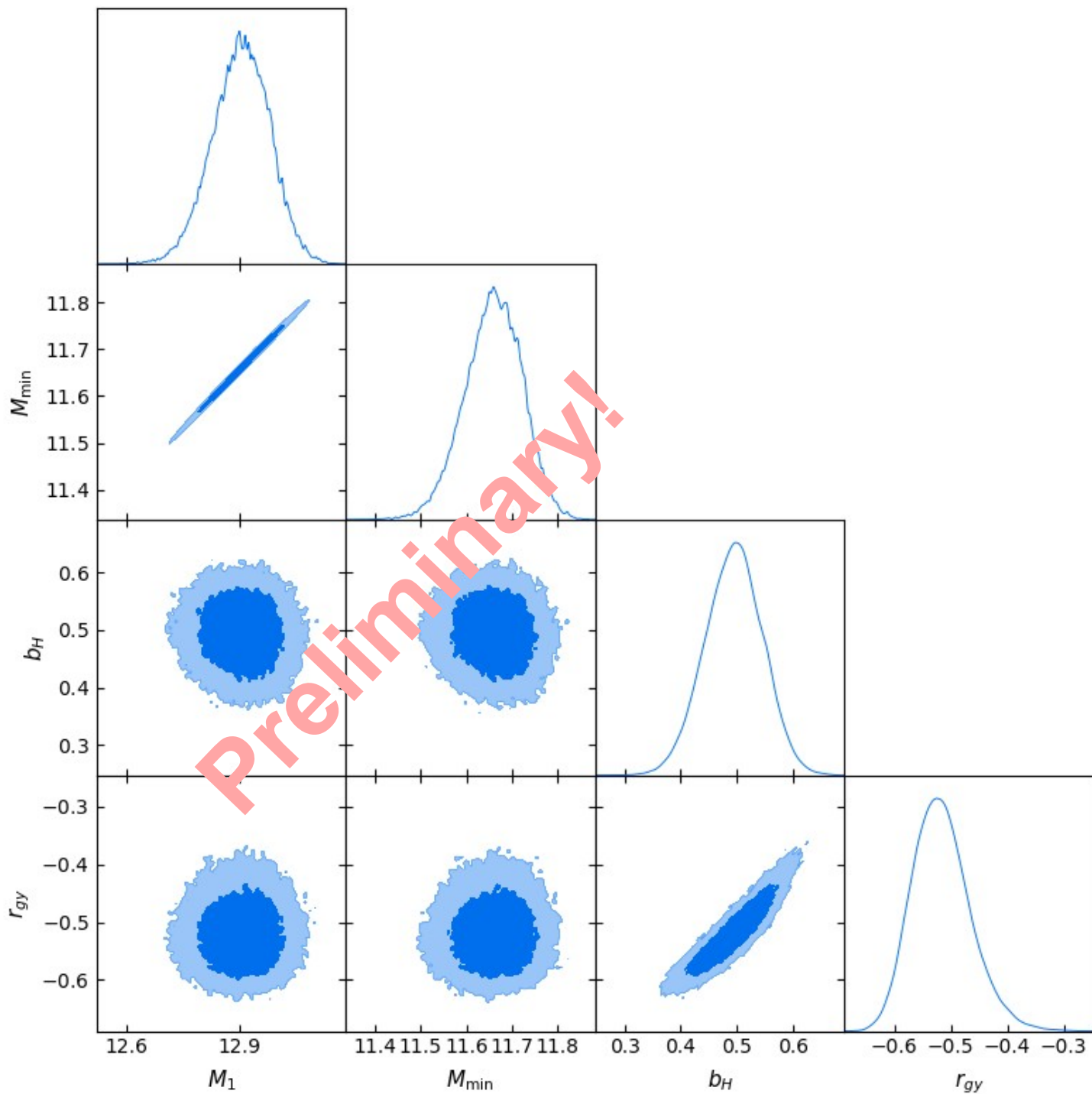
g×g



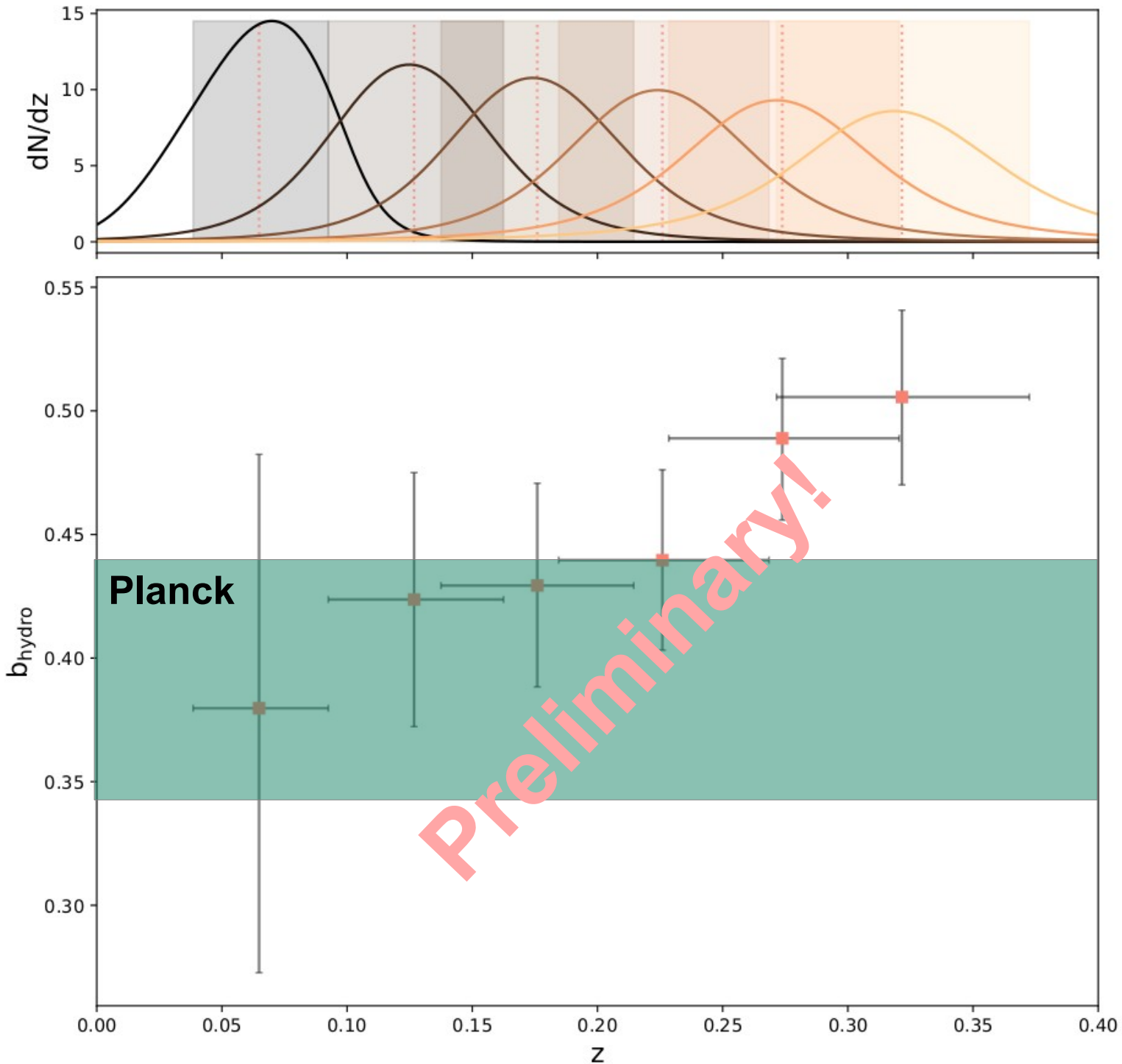
yx9



Results



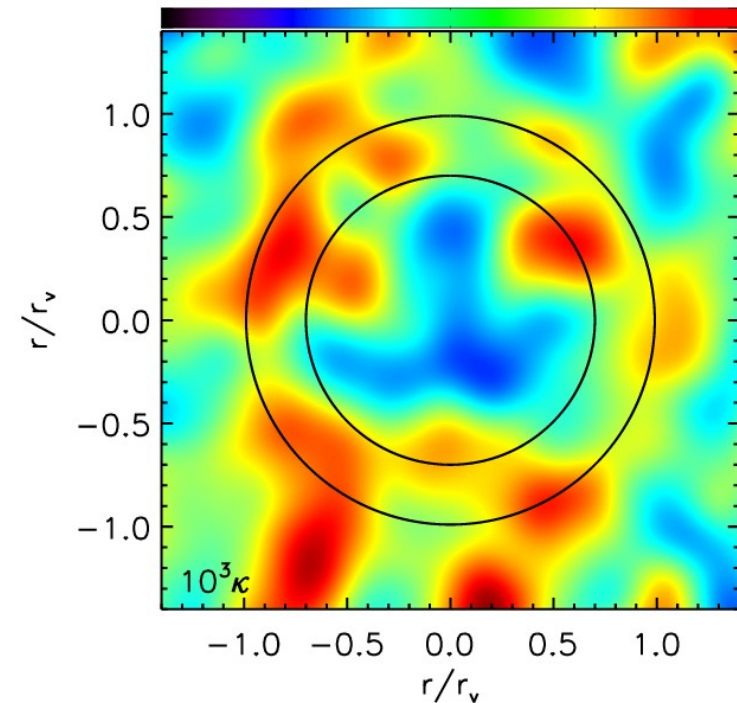
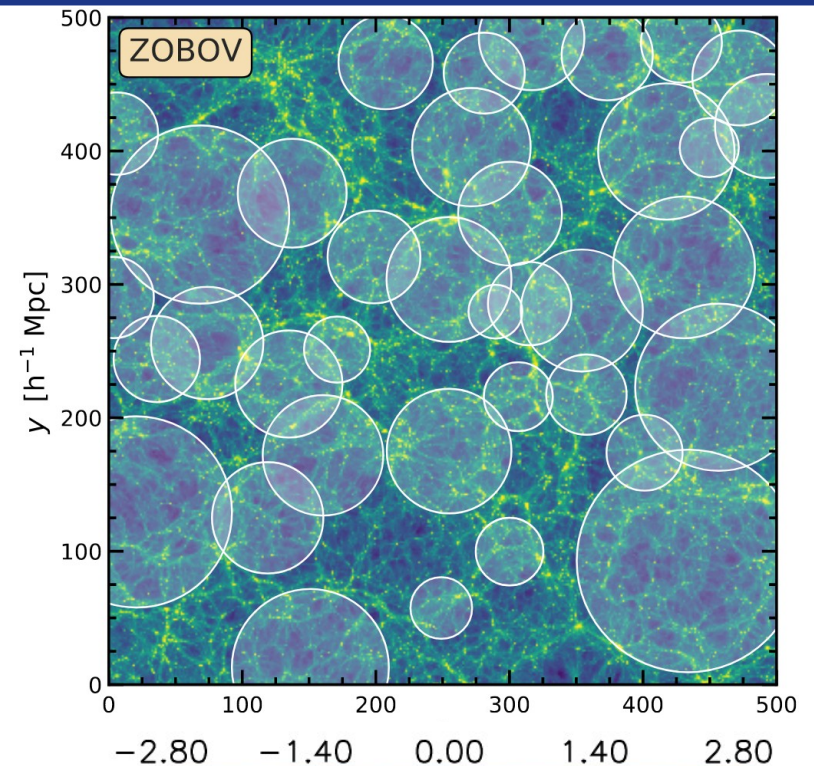
Results



Gas properties in underdense regions

Cosmic voids

- Large (\sim tens of Mpc) underdense regions.
- Main component (by volume) of the cosmic web.
- Interesting for cosmology:
 - Dominated by vacuum energy.
 - “Time-machines” to look into the future.
 - Milder growth \rightarrow easier non-linearity.
- Imprint of voids on the CMB (lensing and ISW) detected at $\sim 3\sigma$



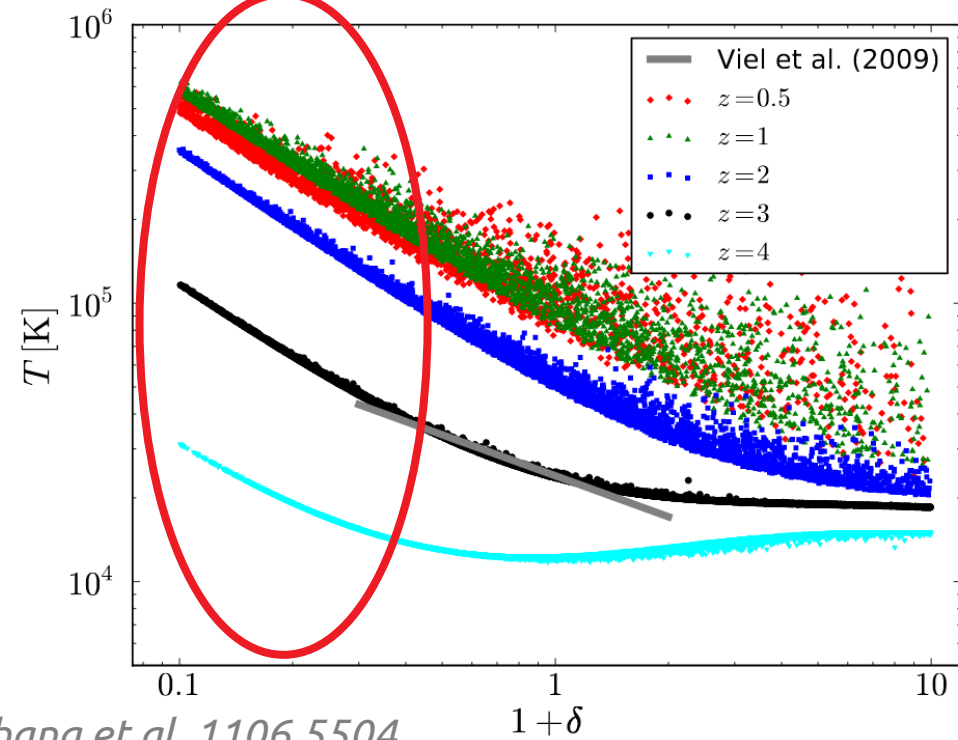
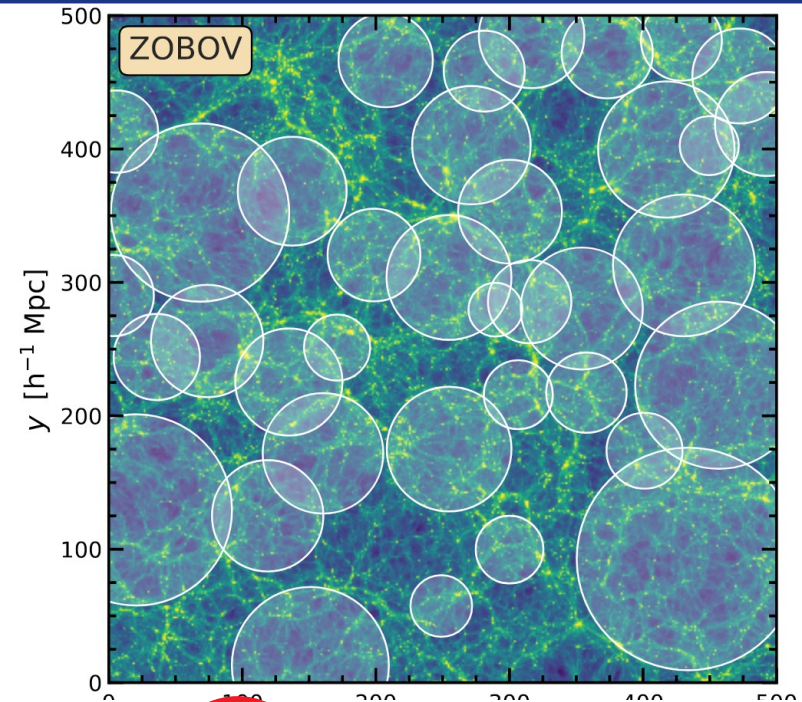
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What could we learn from the tSZ in voids?

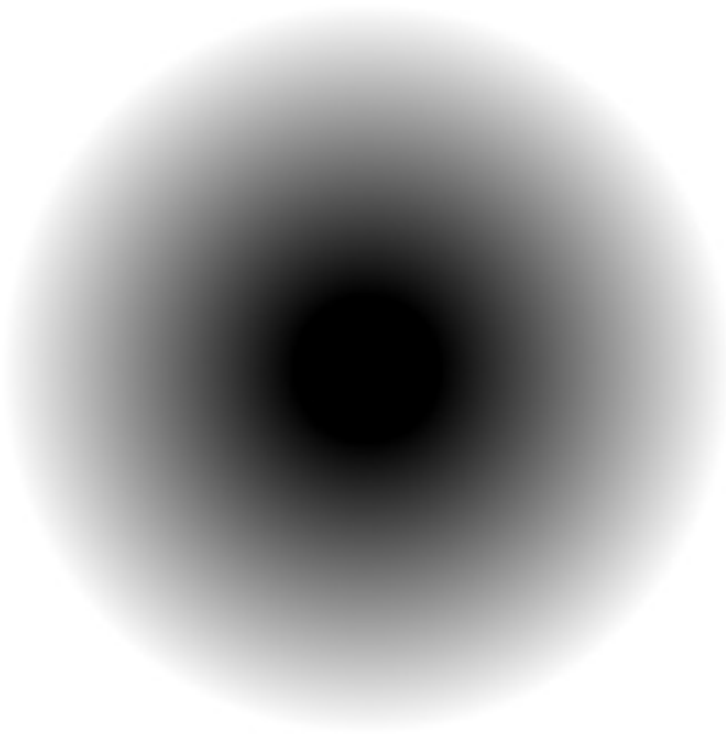
- T- ρ relation in low-density environments
- M-y relation for low-mass haloes.
- Mean gas pressure!
- Conditional halo mass function



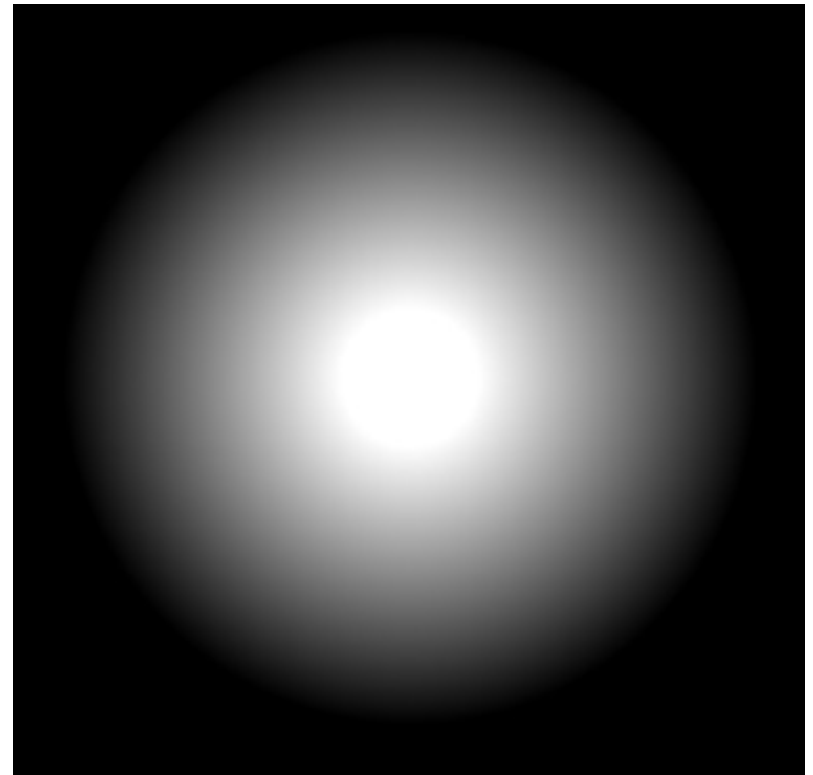
Gas properties in underdense regions

What should we expect?

y



or

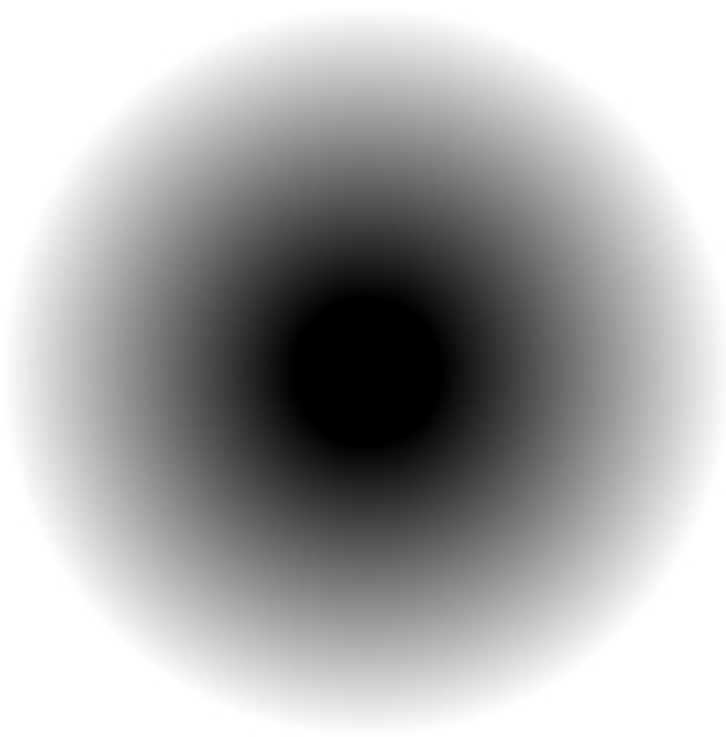


?

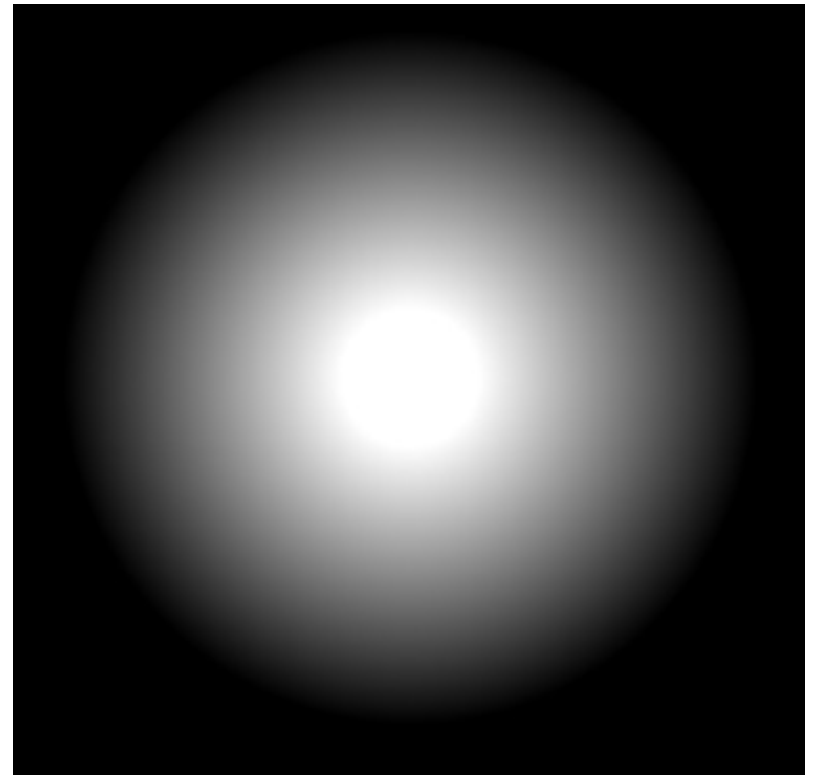
Gas properties in underdense regions

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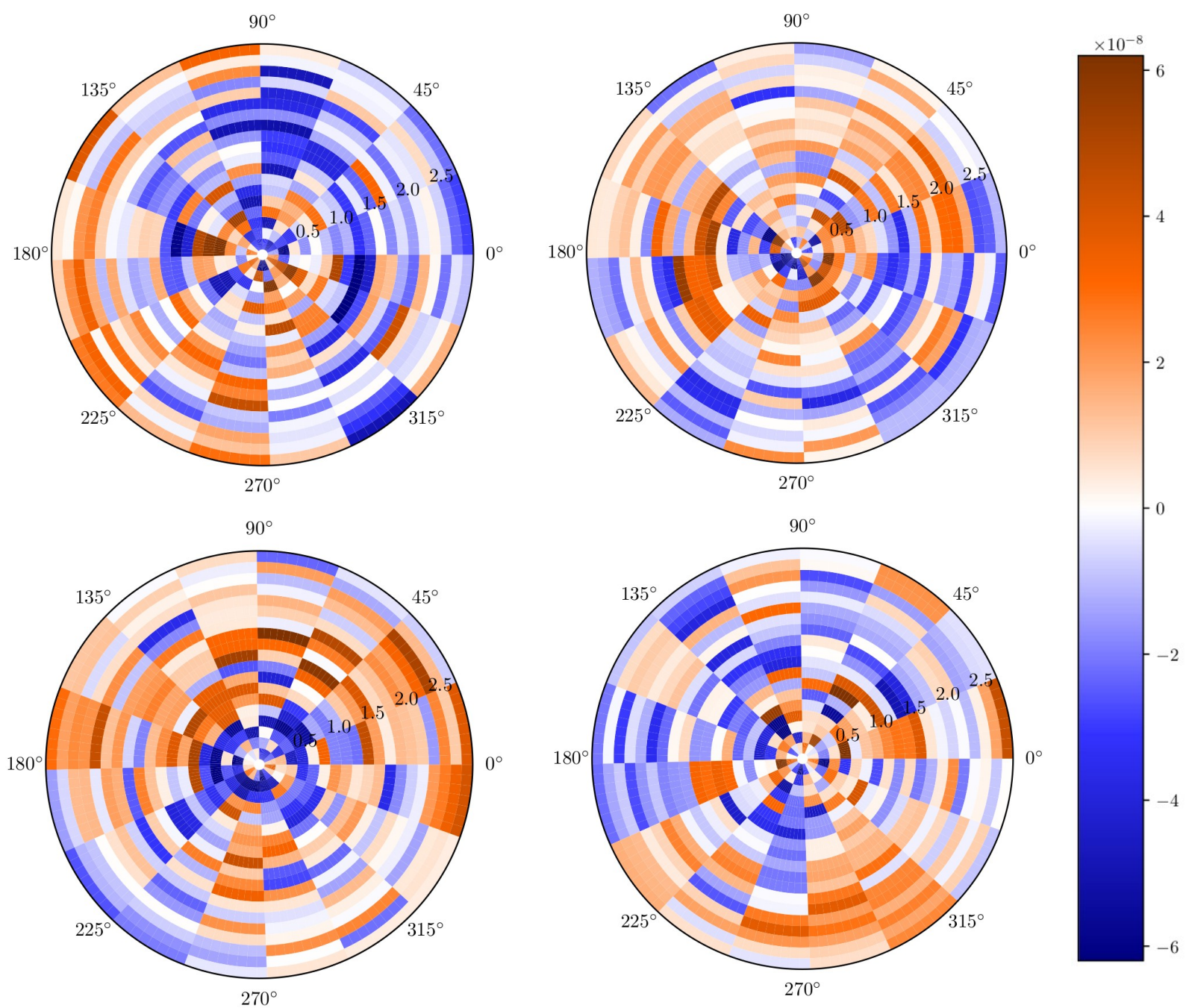
or



?

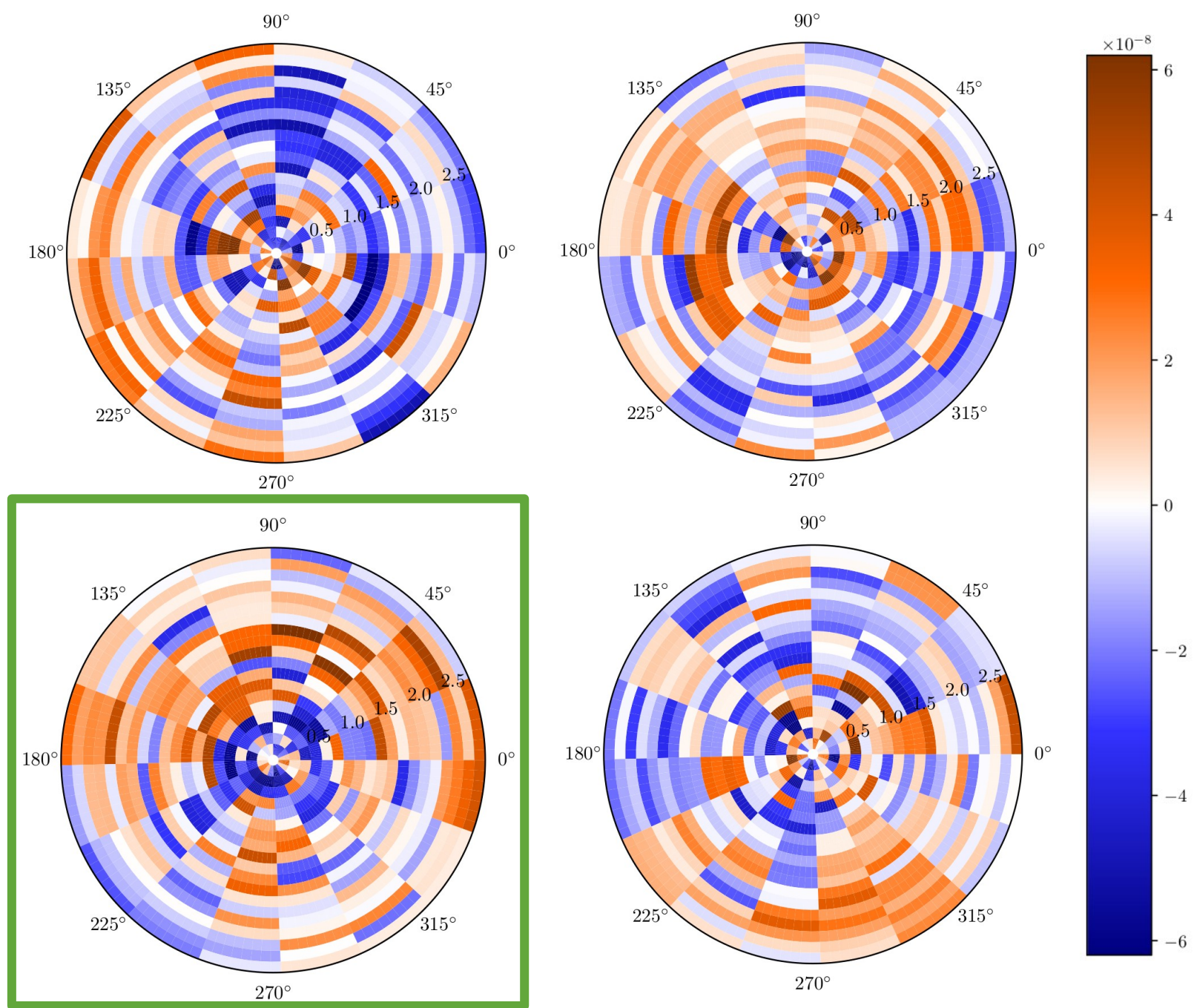
$$P \sim T \cdot \rho \longrightarrow T(\rho)?$$

Gas properties in underdense regions



Find the 3.4σ signal!

Gas properties in underdense regions

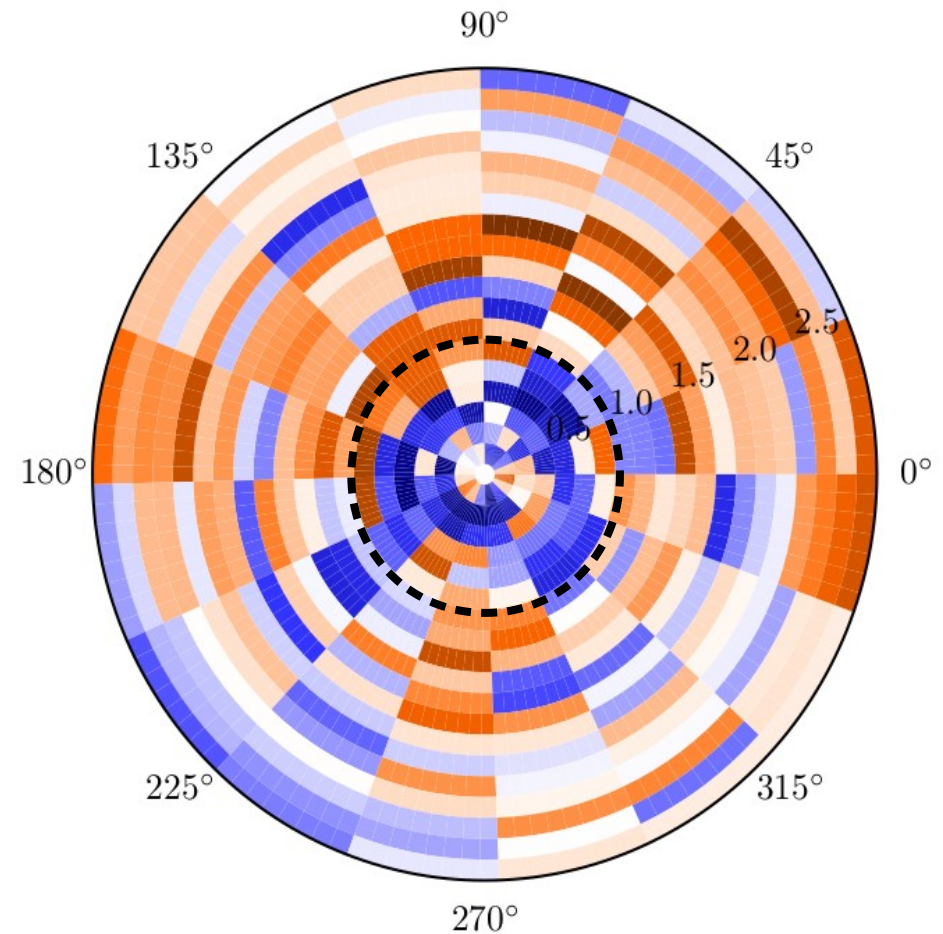


Find the 3.4σ signal!

Gas properties in underdense regions

- tSZ maps from Planck
Planck Coll. et al. 1502.01596
- Void catalog from BOSS DR12
Mao et al. 1602.02771
- First detection of tSZ in cosmic voids
- Thermal properties of diffuse gas.
- Constraints on T- ρ relation.
- Measurement of mean pressure!

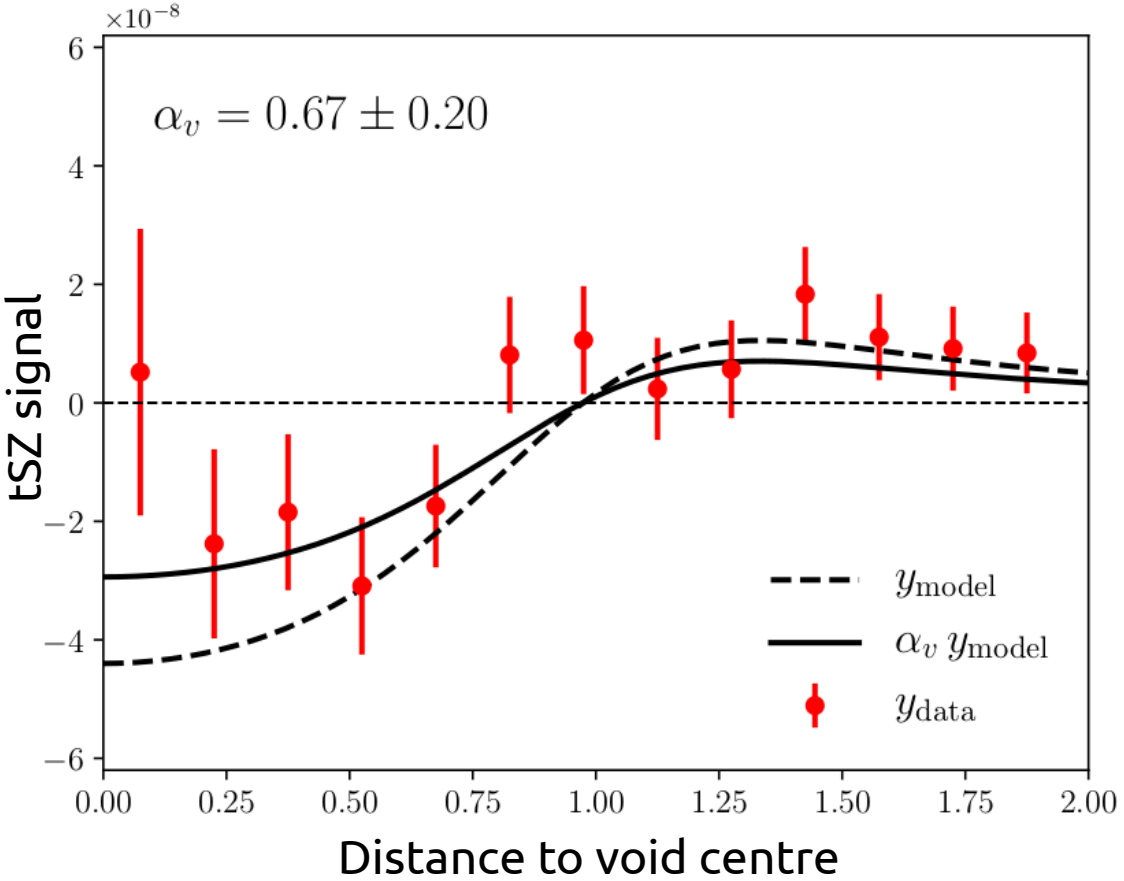
DA et al. 1709.01489



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DA et al. 1709.01489



Summary

- Cosmology is in an exciting era: large upcoming and future datasets + hints of tensions in current data.
- Example: low-redshift probes measure consistently lower growth than CMB.
- Future observatories (e.g. LSST, SO) will improve constraining power massively.
- Secondary CMB anisotropies can help us understand astrophysical uncertainties through cross-correlation with LSS data.
- Mass calibration is the most important challenge for tSZ studies. Can be improved with CMB lensing.
- Cross-correlation with current low-z data shows mild redshift evolution of mass calibration parameters.
- Information about mean gas thermodynamics can be gained from cross-correlation with cosmic web elements.

Thanks!