

Upgrading the CMB foreground and lensing analysis: improved halo models and a global minimum variance quadratic estimator

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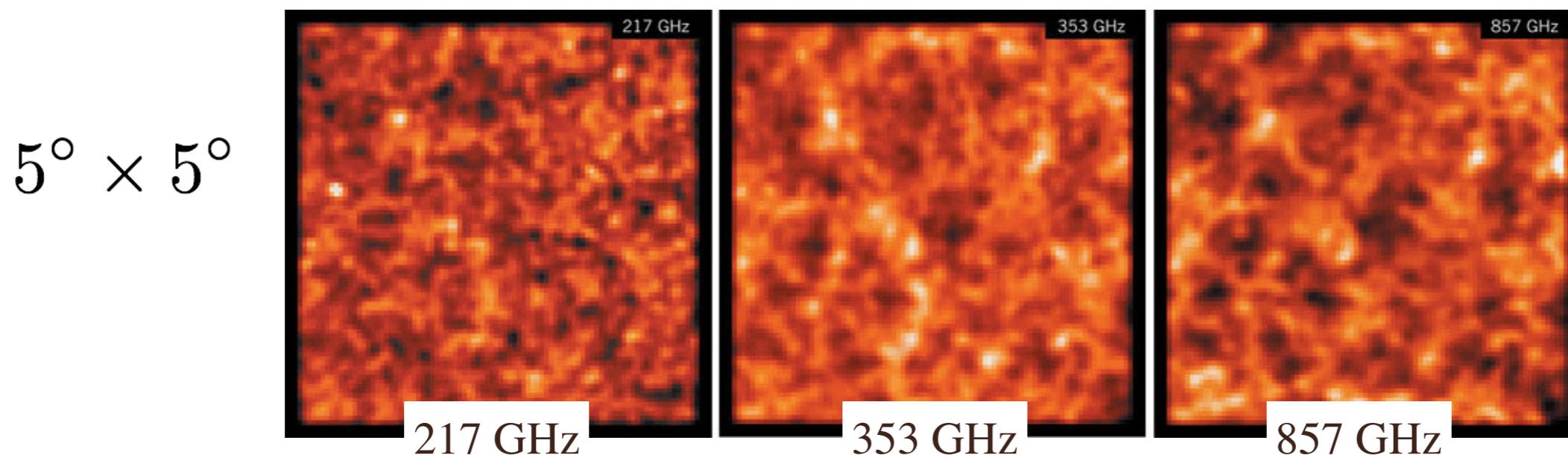
CIB, tSZ, CIB x tSZ

CIB Clustering on linear scales: a signal

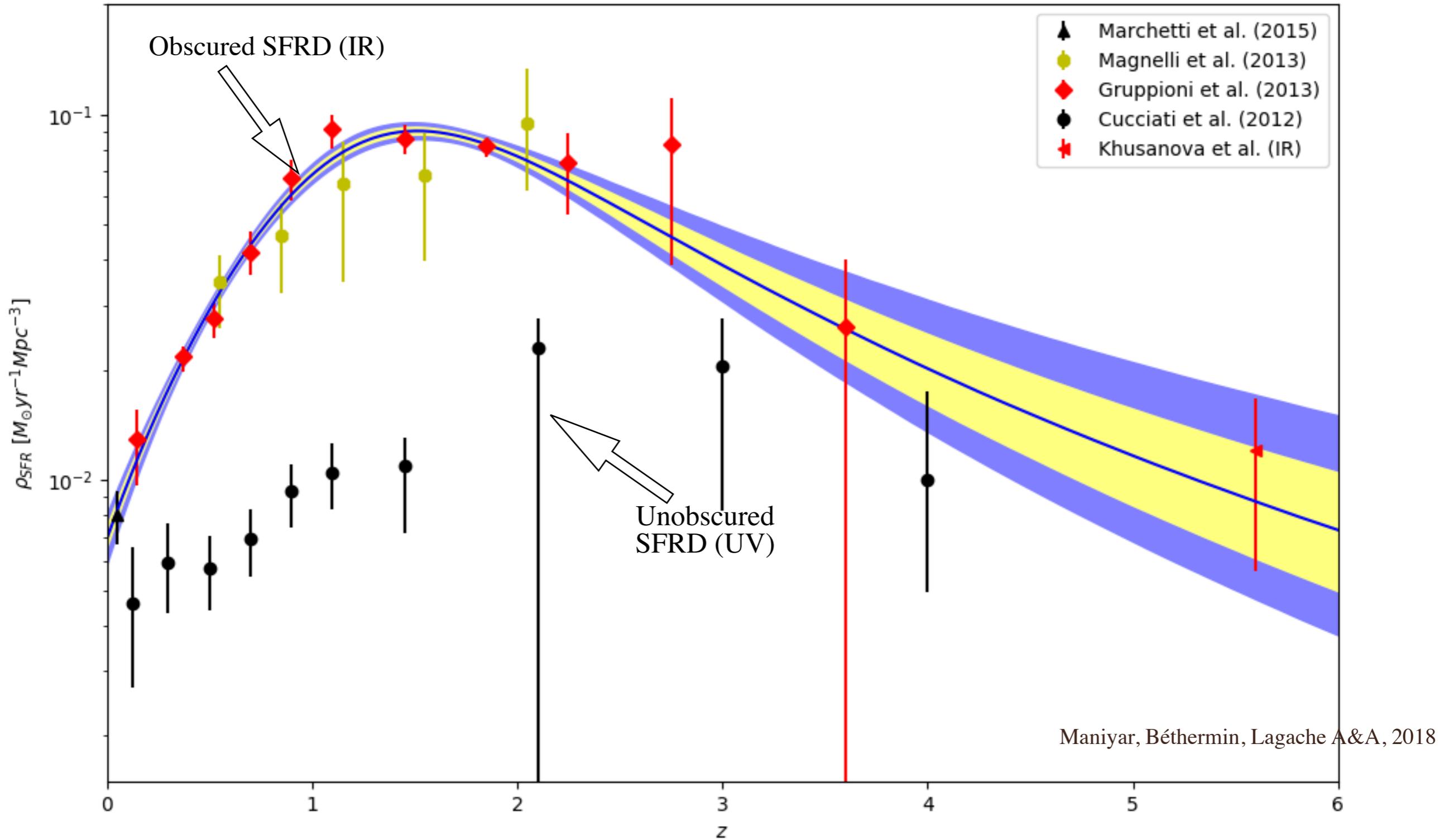
Maniyar, Béthermin, Lagache A&A, 2018

Cosmic Infrared Background (CIB)

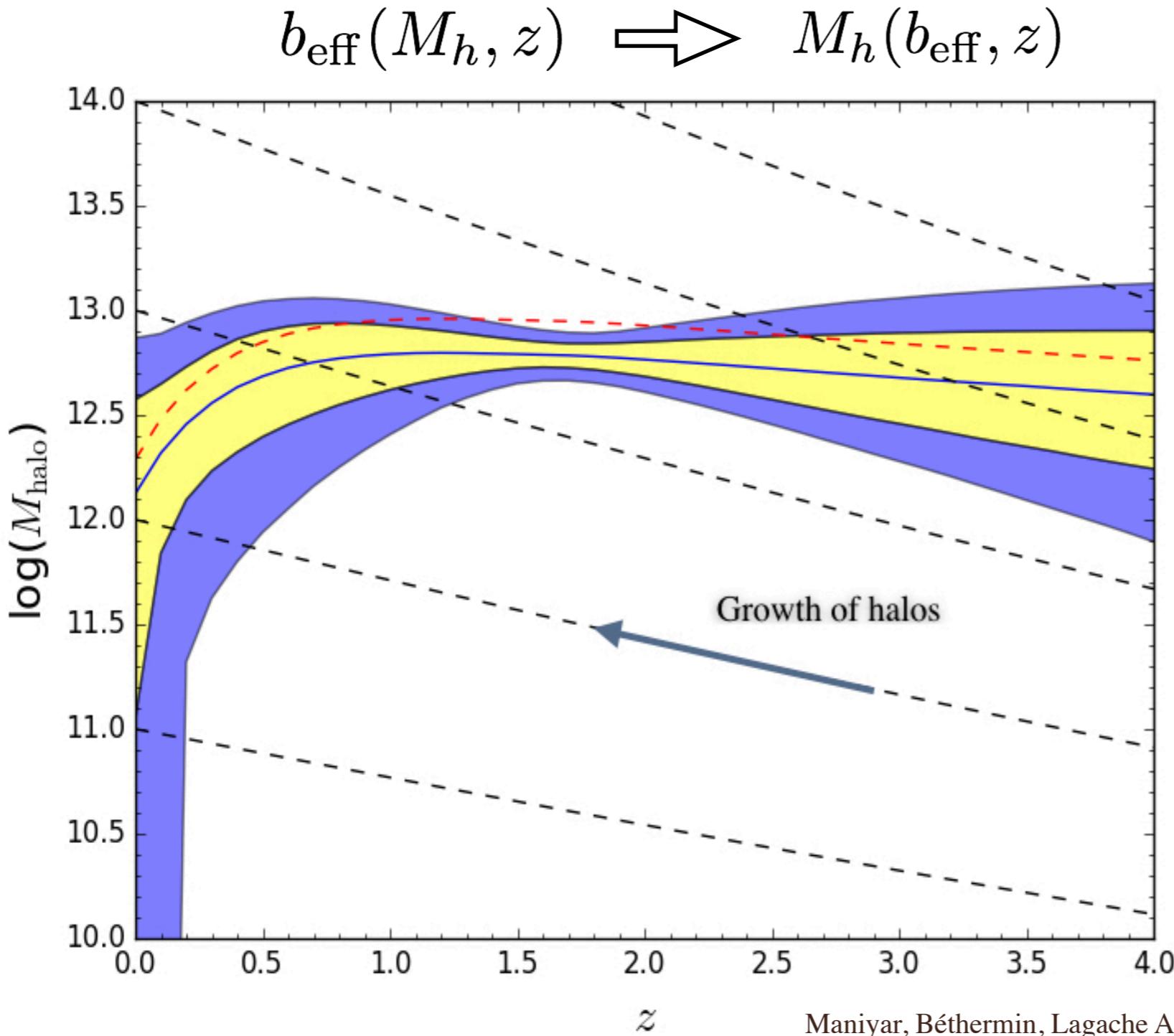
- Cumulative IR emission from dusty star forming galaxies throughout the cosmic history
- CIB galaxies clustered in the host dark matter halos
 - ♦ Anisotropies in the CIB
- CIB anisotropies => **Trace the large scale distribution of dusty star forming galaxies => underlying dark matter distribution**



Star formation rate density history



Dark matter halo mass for the CIB emitters



For $z > 2.5$
 $M_h(z = 0) > 10^{13.5} M_\odot$
Progenitors of
clusters

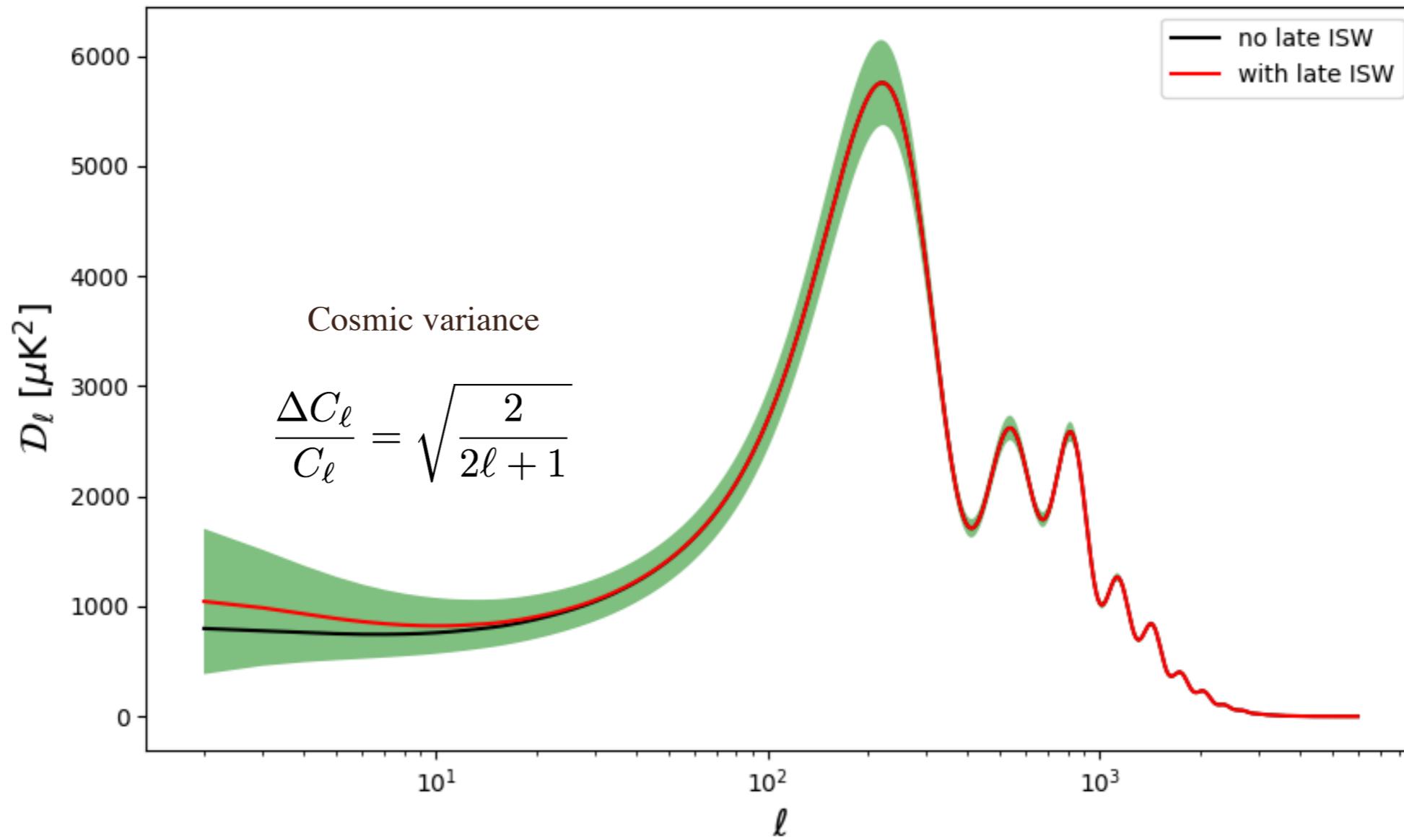
For $0.3 < z < 2.5$
 $10^{12.5} < M_h(z = 0) < 10^{13.5} M_\odot$
Groups

For $z < 0.3$
 $10^{12} < M_h(z = 0) < 10^{12.5} M_\odot$
Milky Way like
halos

ISW (dark energy) through CIB-CMB cross-correlation

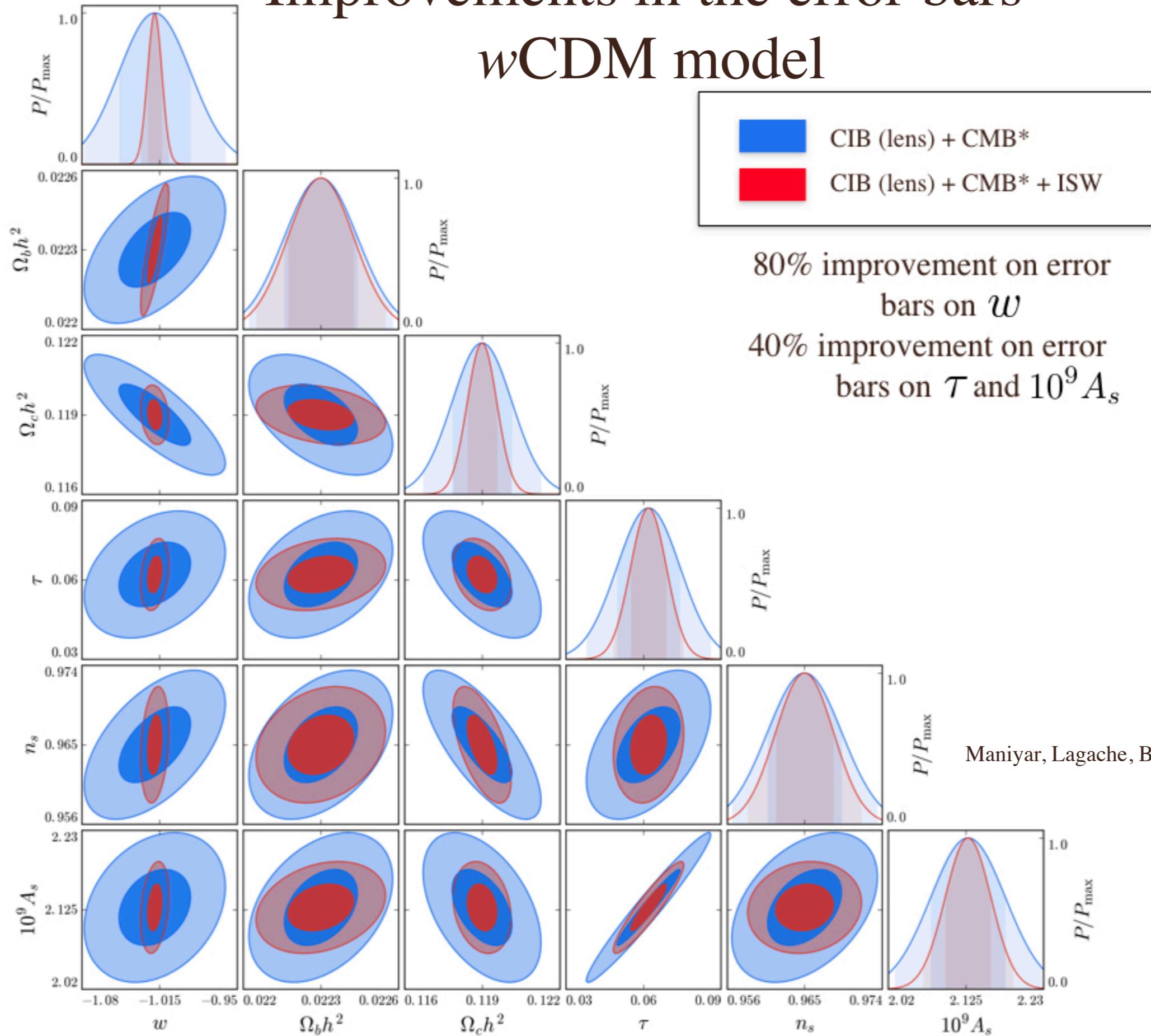
Maniyar, Lagache, Béthermin A&A, 2019

ISW in the CMB power spectrum

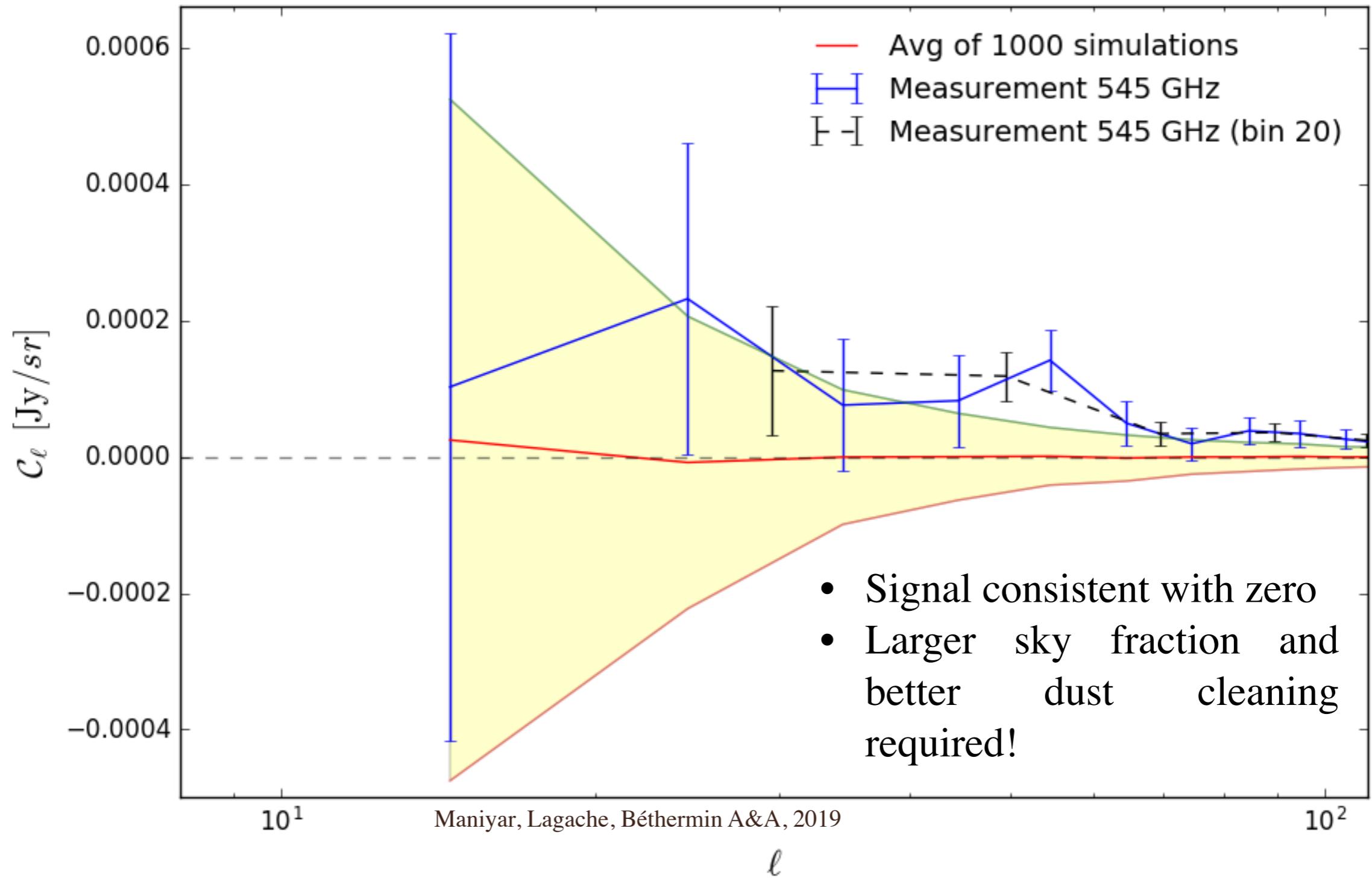


- Integrated Sachs-Wolfe effect Really small!
- Cross-Correlation with LSS tracers
- SNR going up to 4

Improvements in the error bars w CDM model



Real CIB & CMB maps: Null test

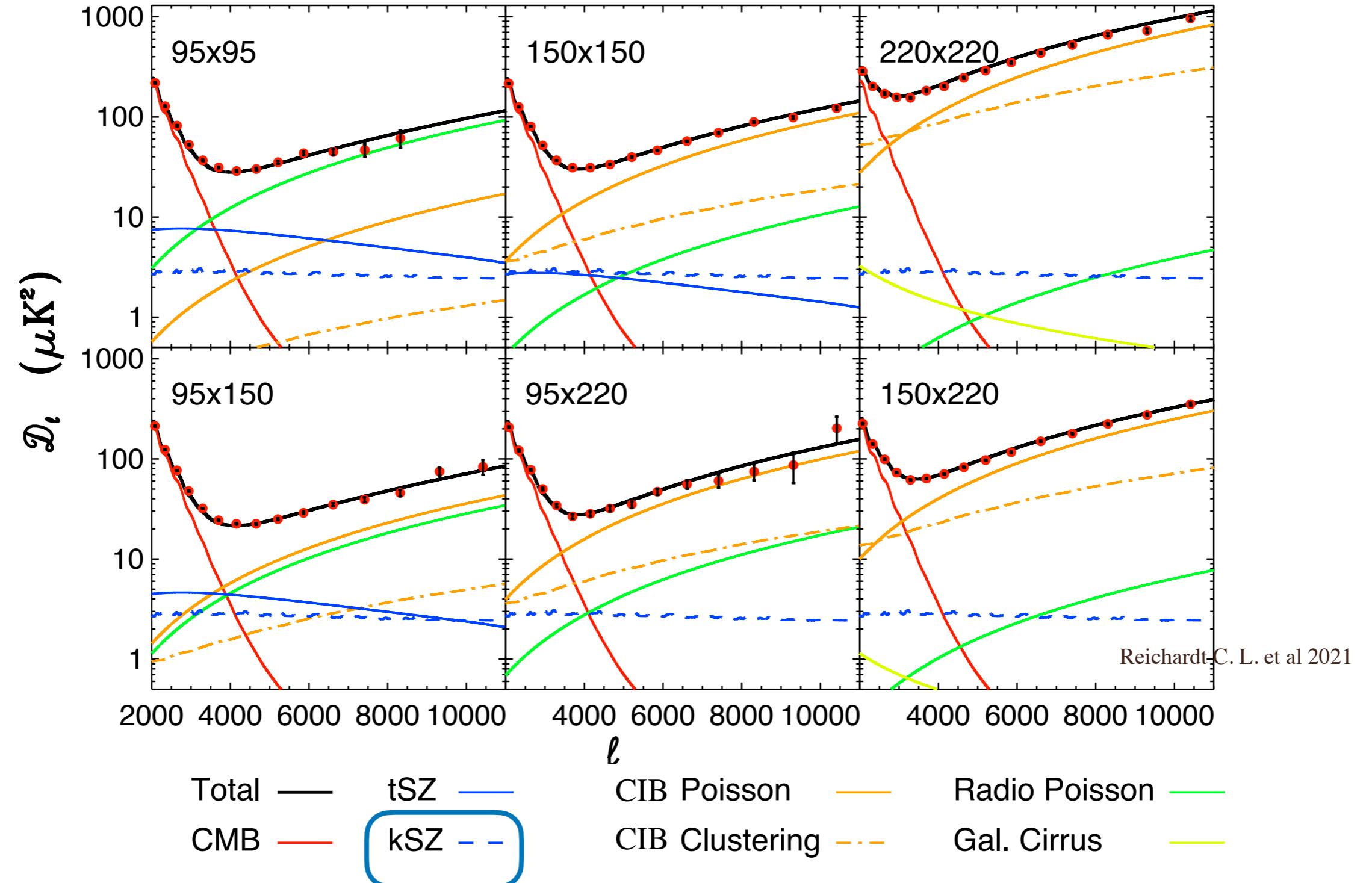


On large scales, CIB and CMB combination: a cosmological signal
What about small scales?

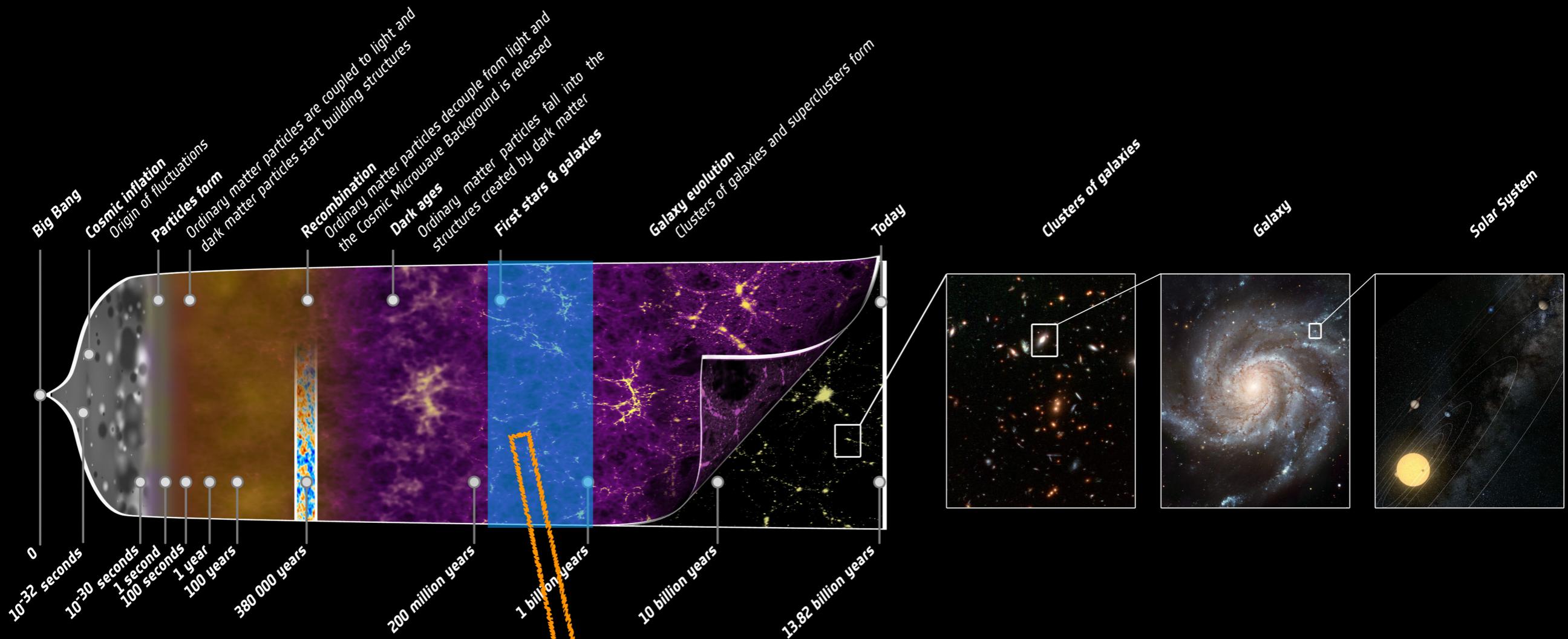
It's complicated!



CMB power spectrum on small scales: very complicated indeed!



Why kSZ? => A reionization probe!



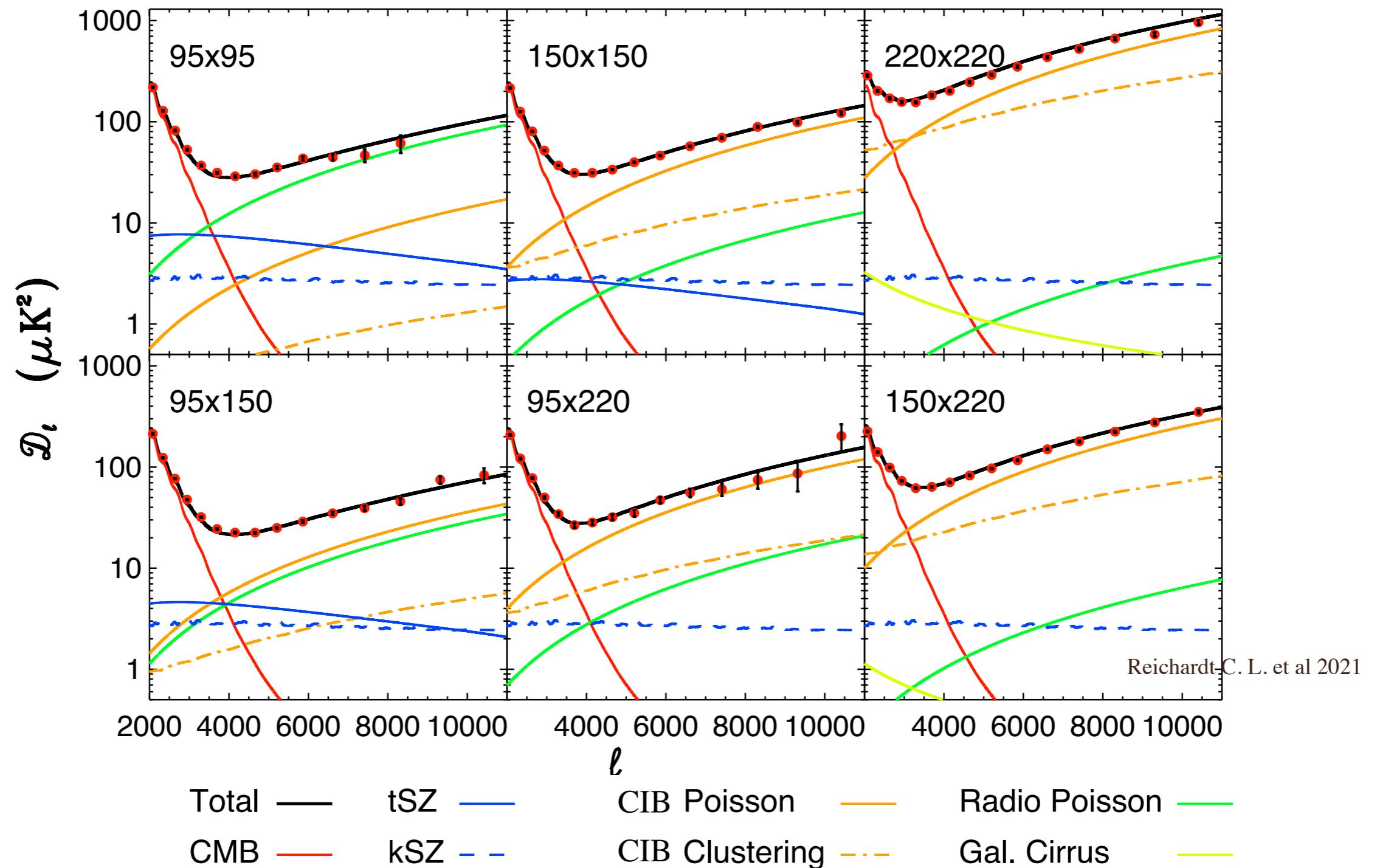
Measuring the kSZ power spectrum

- When did the reionization happen?
- How long did it last?

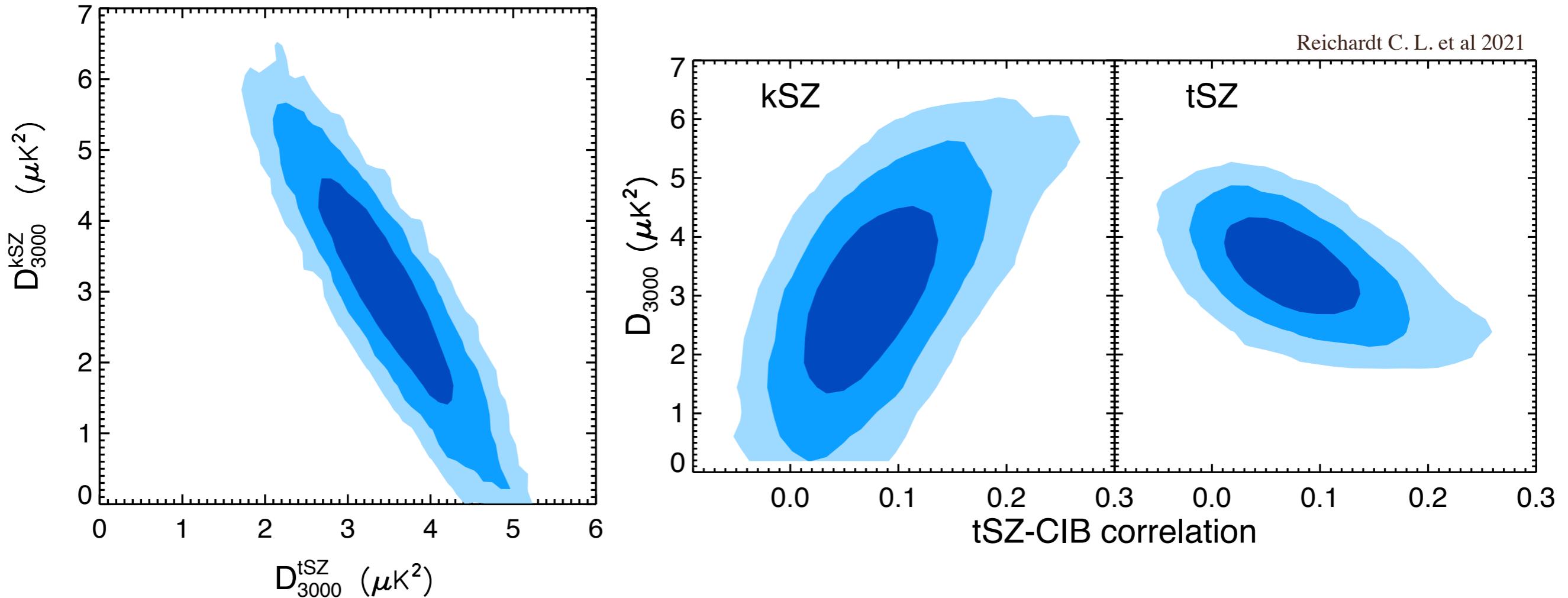
Measuring the kSZ power spectrum from the CMB data

In collaboration with: Matthieu Tristram,
Guilaine Lagache, Xavier Garrido

kSZ and the foregrounds in the CMB power spectrum: challenging!

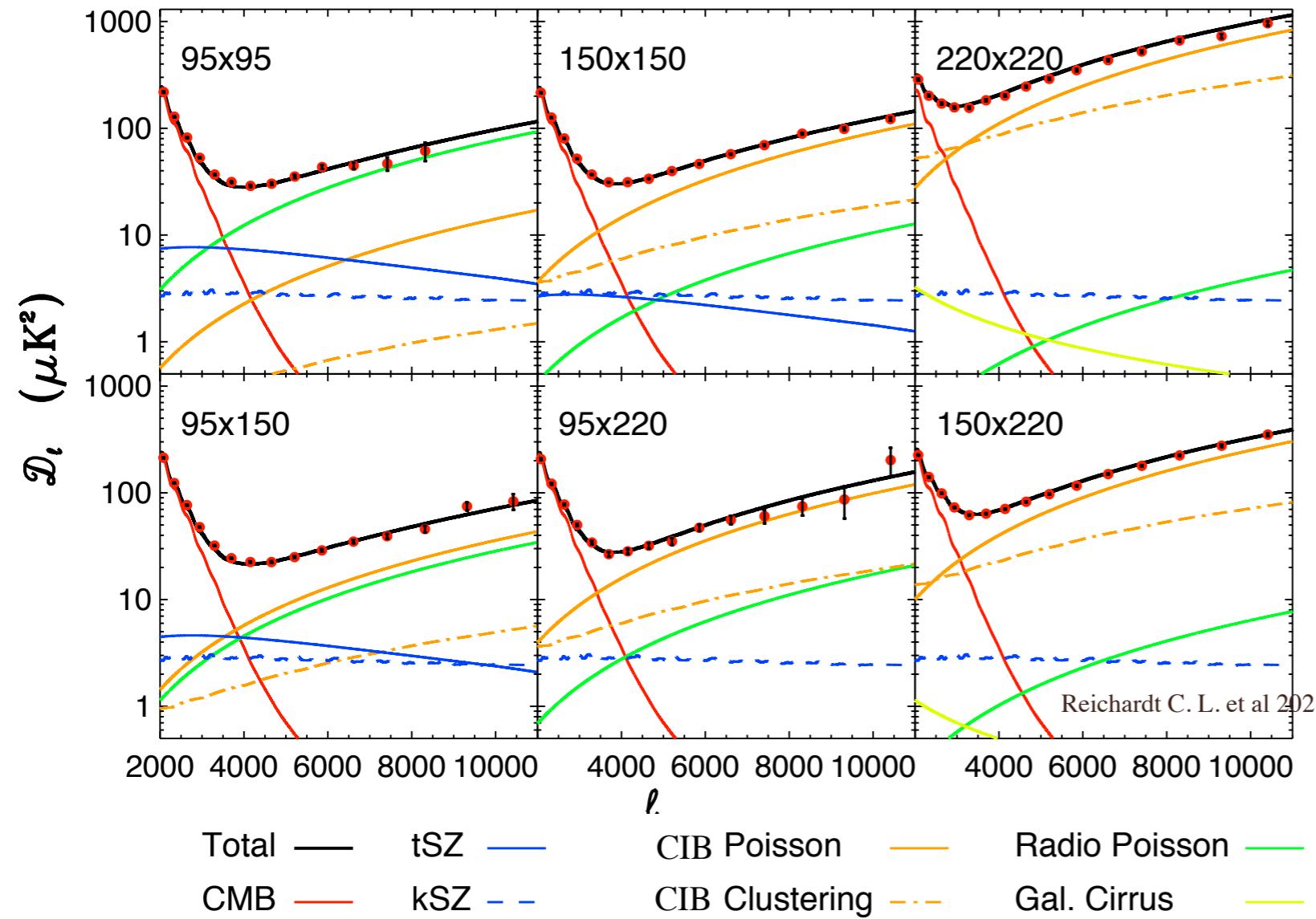


kSZ and the foregrounds correlations



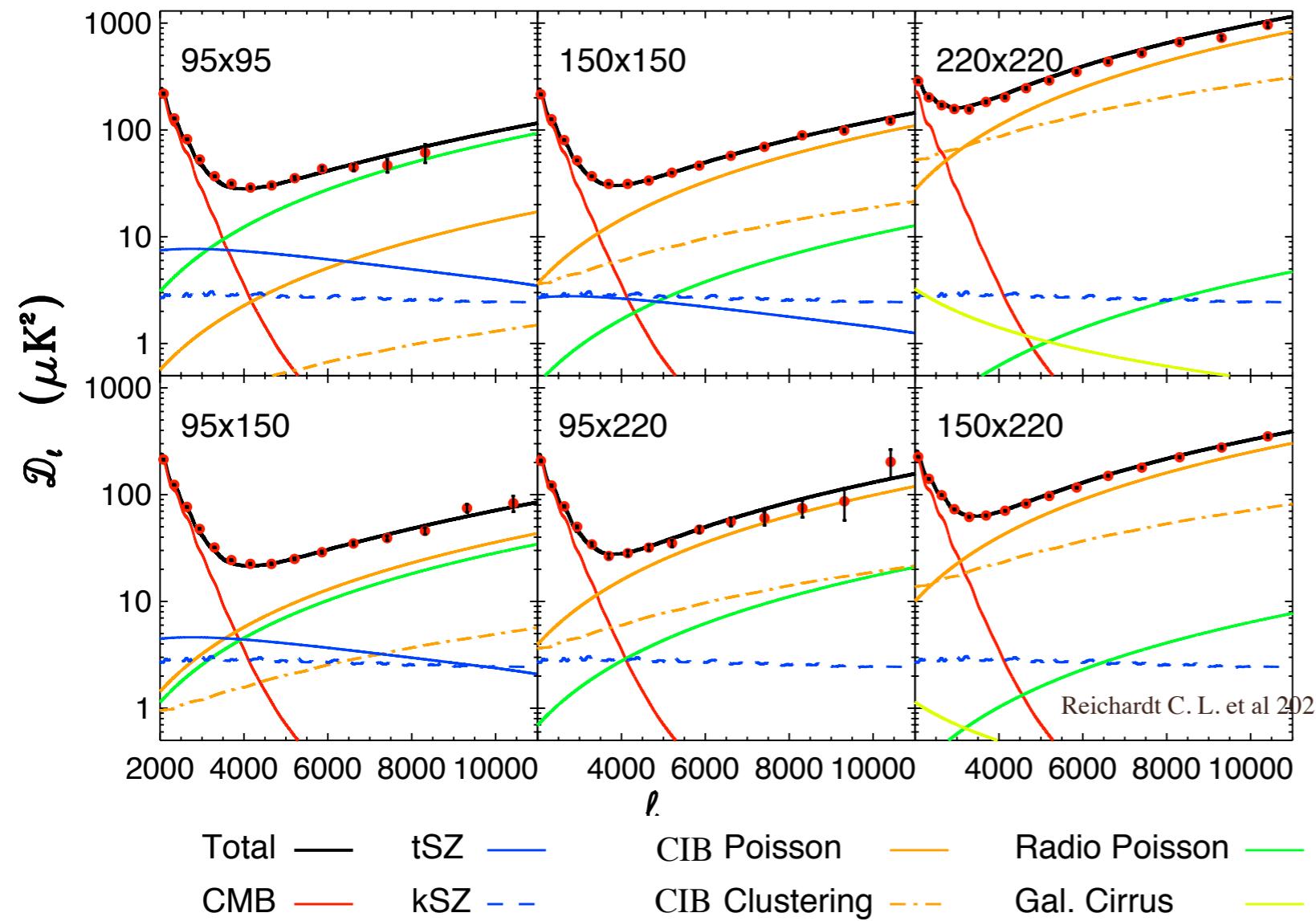
Data quality getting better and better (SO, CMB Stage-4)!
=> Need precise and reliable models!

Current approach and limitations



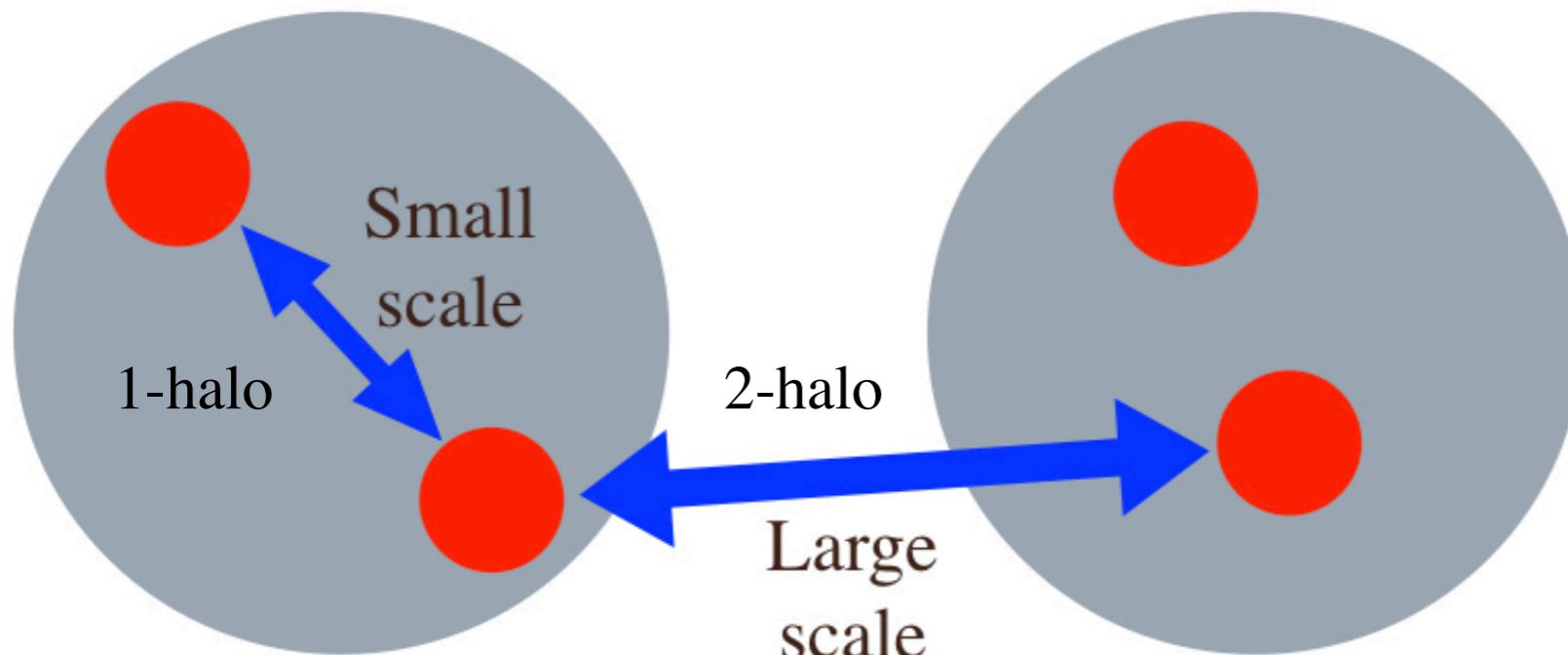
- Power law/best fit templates for the CIB, tSZ, and CIB x tSZ
- Different frequency channels assumed to be perfectly correlated for the CIB
- Inconsistencies between the CIB, tSZ and CIB x tSZ templates
- Cosmology dependence

What we need



- Physically motivated halo model for the CIB and tSZ
- Consistent halo model for CIB-tSZ correlation
- Cosmology dependance explicitly considered
- Combining different frequency data (Planck, SPT, and ACT; Herschel, Planck HFI)

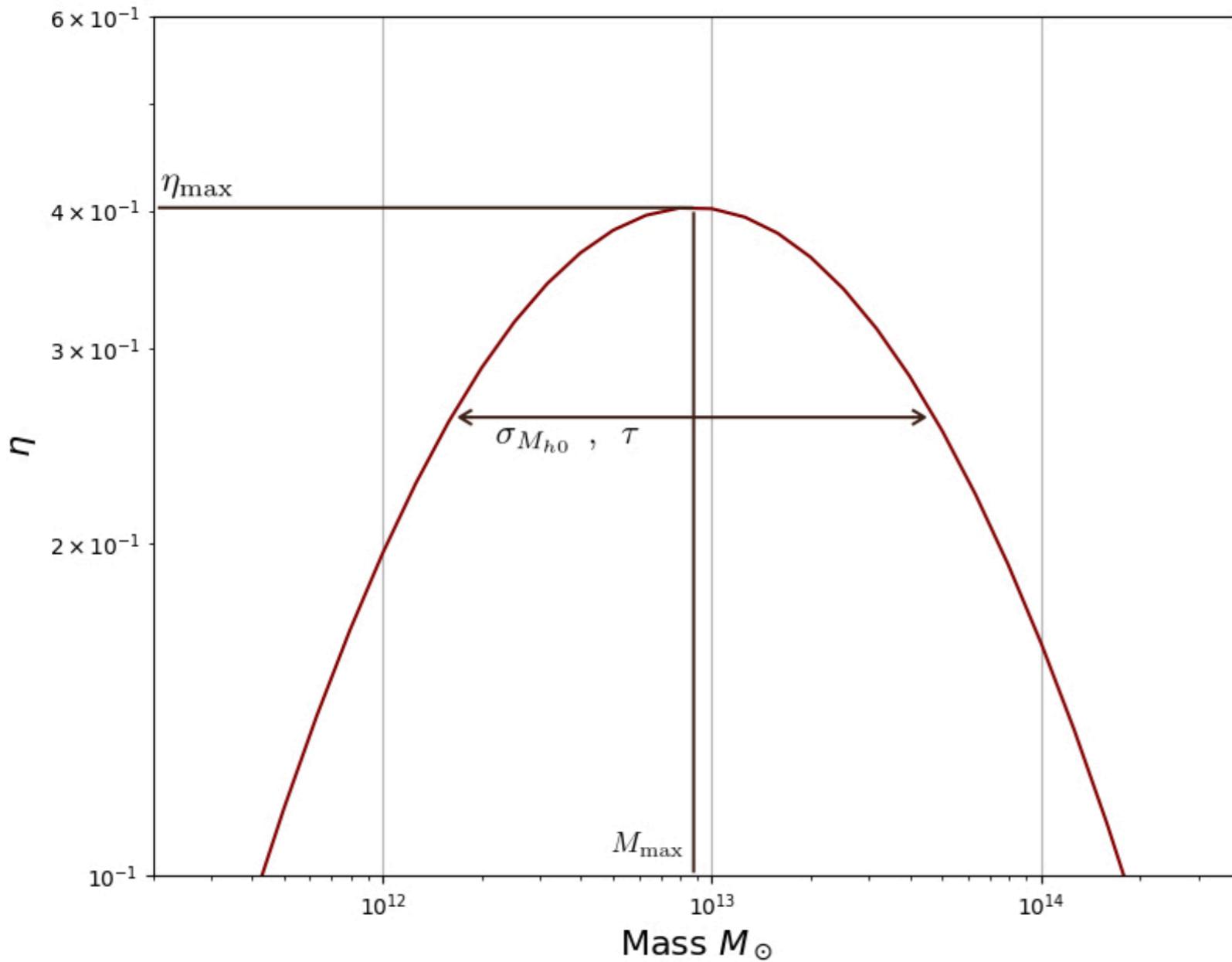
Halo model required



Previous halo models

- L-M relation (Shang et al 2012)
- High number of parameters
- Results not consistent with data => SFRD

Accretion on the dark matter halos to SFR



Baryonic Accretion Rate

$$\text{BAR}(M, z) = \langle \dot{M}_h(M, z) \rangle \times \Omega_b(z)/\Omega_m(z)$$

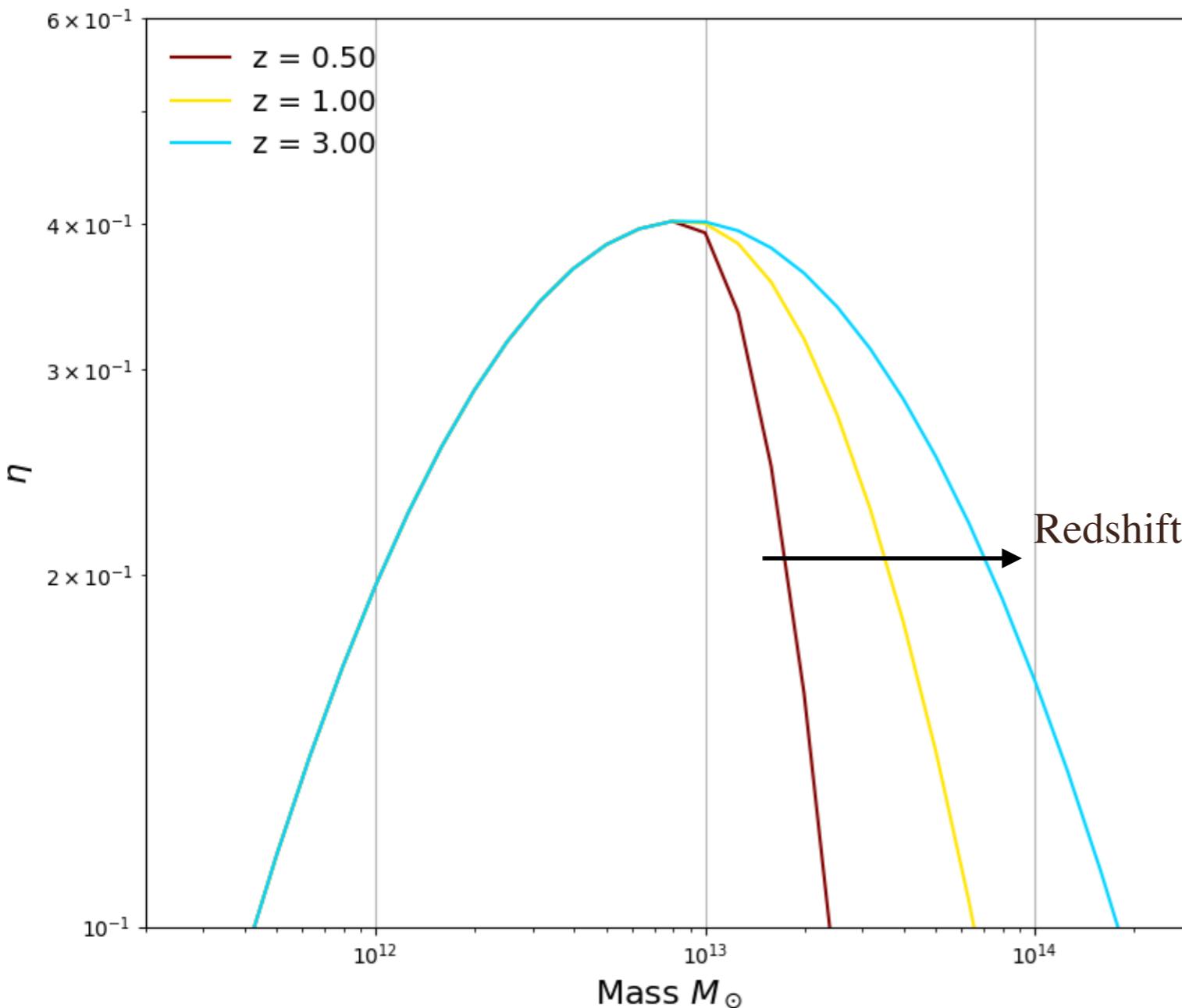
Efficiency to convert accreted baryons
into stars

$$\frac{\text{SFR}}{\text{BAR}} = \eta = \eta_{\max} e^{-\frac{(\log M_h - \log M_{\max})^2}{2\sigma_{M_h}^2}}$$

Calculating SFR

$$\text{SFR}(M_h, z) = \eta(M_h, z) \times \text{BAR}(M_h, z)$$

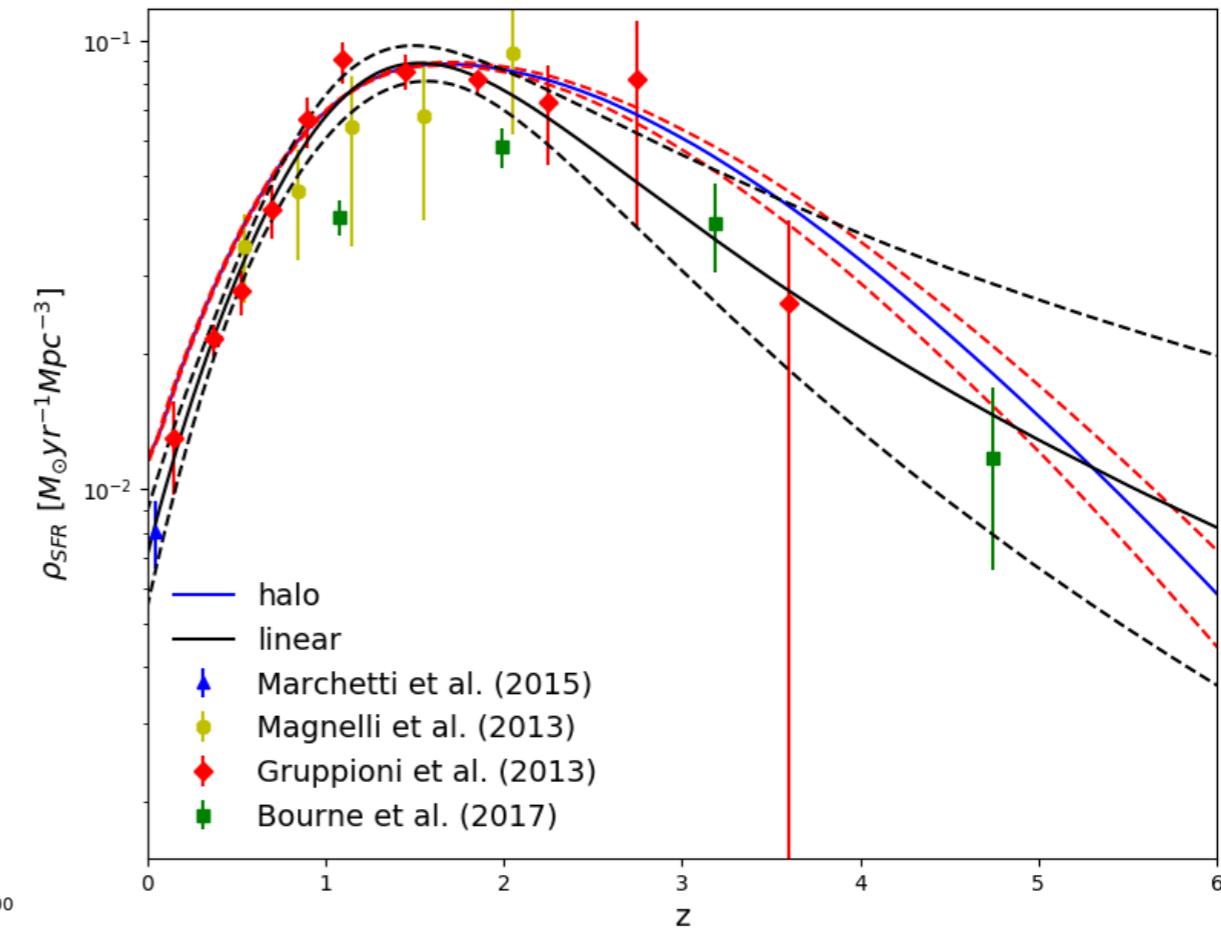
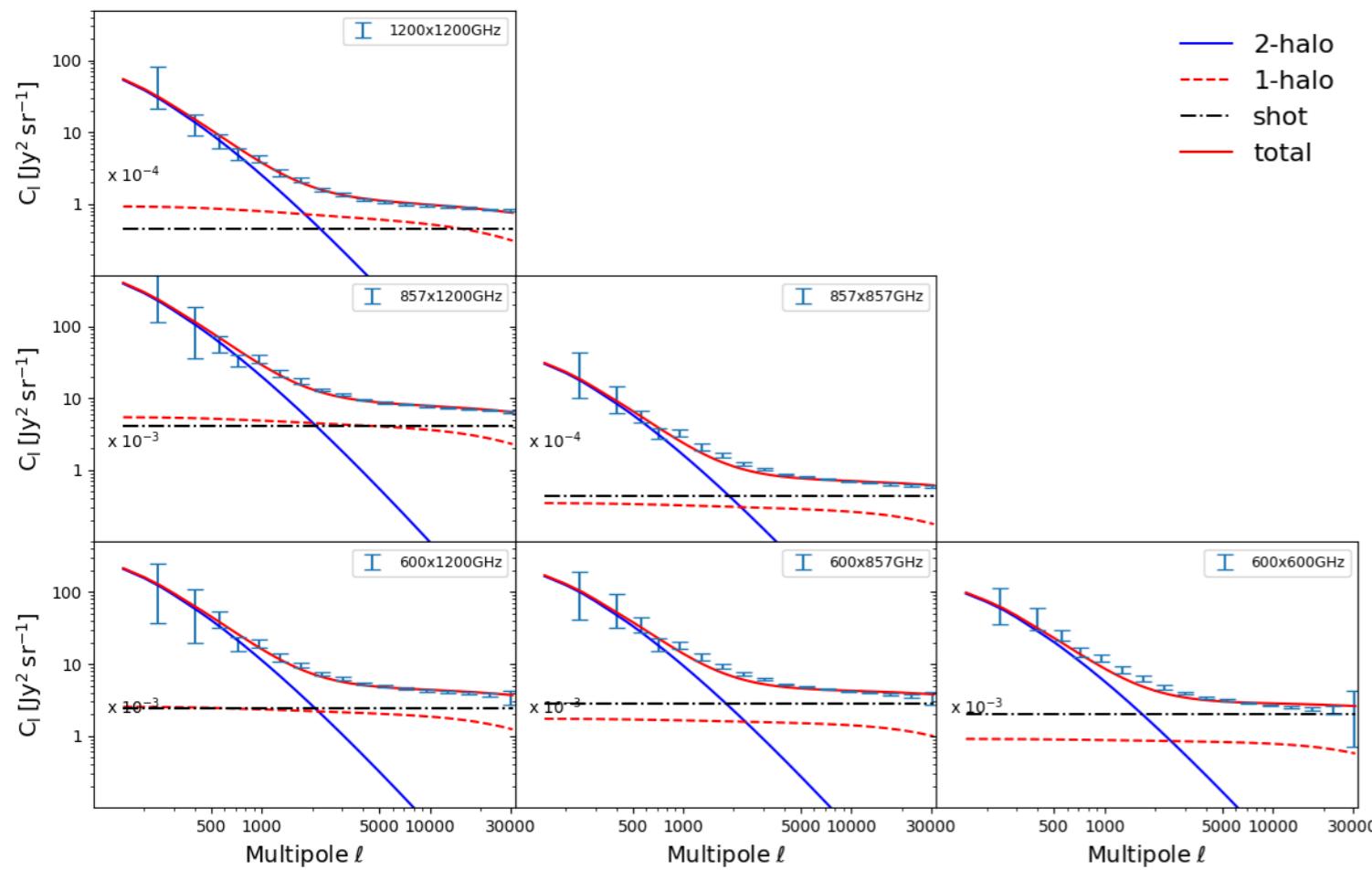
Accretion on the dark matter halos to SFR



$$\text{SFR} \Rightarrow \frac{dj_\nu}{d \log M}(M, z) \Rightarrow C_\ell^{\nu, \nu'}$$

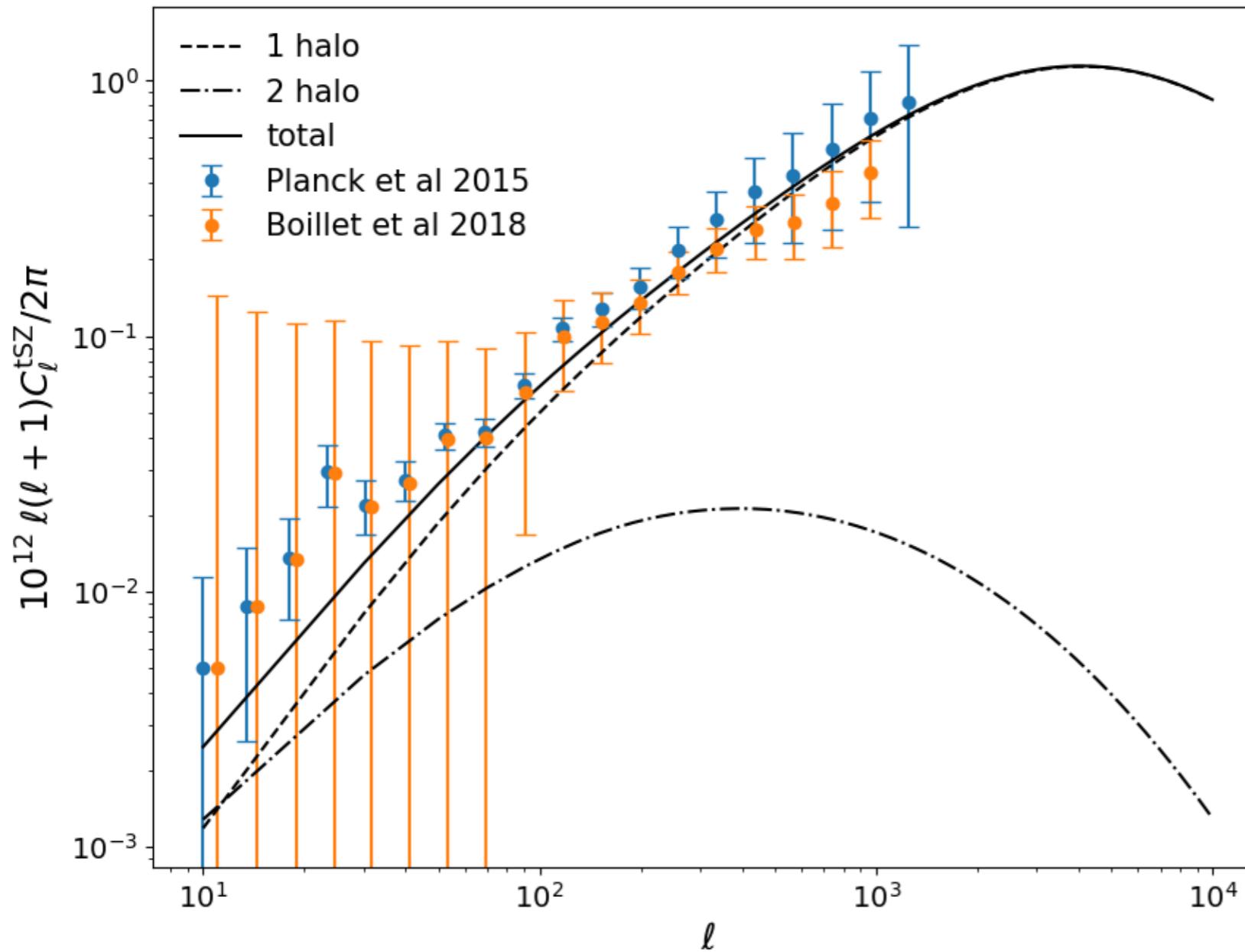
- Evolution in width of the lognormal up to a redshift
- Massive halos at lower redshift inefficient star formation (e.g. Popesso et al. 2015)
- Massive halos at high redshift can have efficient star formation (e.g. Miller et al. 2018)

Fitting both Planck and Herschel data & consistent with data for SFRD



Maniyar, Lagache, Béthermin, A&A, 2021

tSZ halo model (both 1-halo and 2-halo terms)



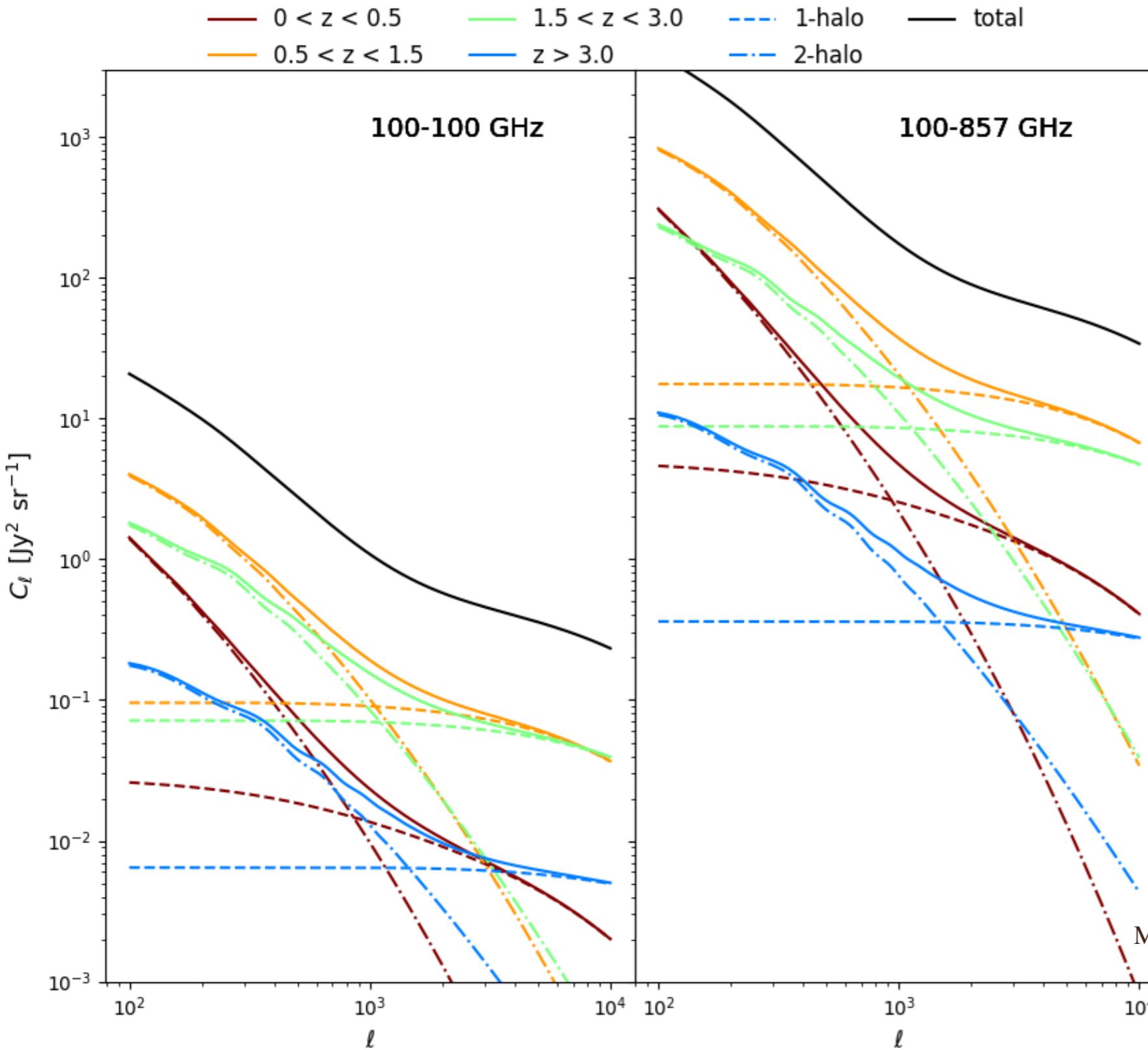
$$\tilde{M}_{500c} = M_{500c}/B$$

Mass bias parameter

CIB x tSZ correlation

- CIB => tracing the large scale structure
- tSZ => hot electrons in the galaxy clusters => large scale structure
- CIB galaxies residing in the clusters contributing to the tSZ => one halo term
- Overlap in the redshift distribution of the CIB and the tSZ => two halo term

Redshift distribution: CIB x tSZ power spectra



- tSZ: low redshift
- CIB: low frequency \Rightarrow high redshift \Rightarrow contribution from lowest and highest redshift bin almost similar
- CIB-tSZ: 2-halo non-negligible

Maniyar, Lagache, Béthermin, A&A, 2021

Our approach

- ✓ Physically motivated halo model for the CIB and tSZ
- ✓ Consistent halo model for CIB-tSZ correlation
- ✓ High- l Likelihood on Polarized Power spectra (HiLLiPOP) likelihood
- ✓ Combining different frequency data (Planck, SPT, and ACT for the CMB; Herschel/Spire, Planck/HFI for the CIB)
- ✓ COBAYA toolbox for MCMC
 - ✓ Replacing old templates for foregrounds with halo models
 - ✓ Cosmology dependance of all the foregrounds explicitly considered at every step
 - Integrating SPT likelihood

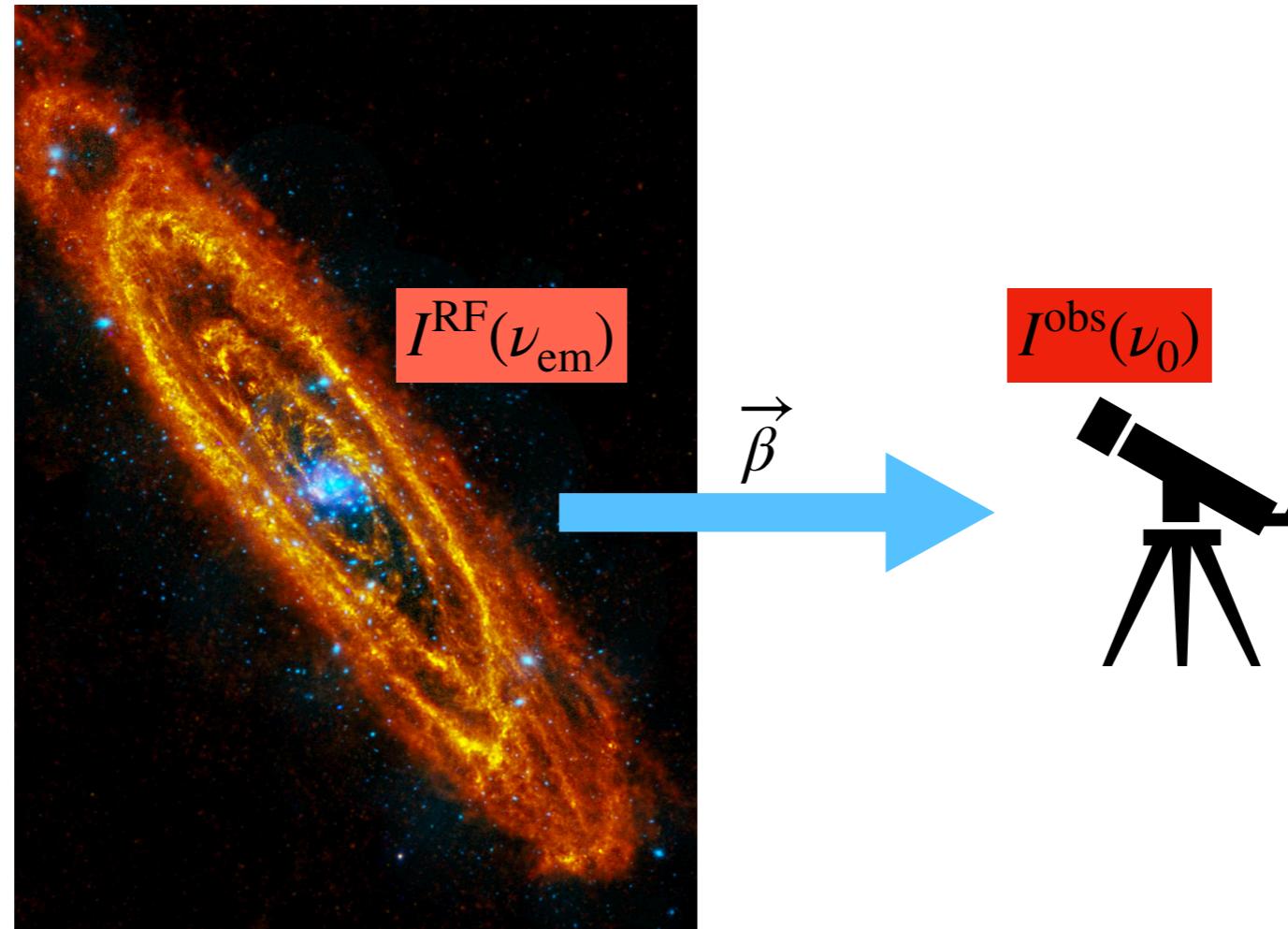
Next steps

- Combined MCMC with Planck, ACT, SPT, Herschel data
- kSZ power spectrum
- Reionisation constraints

Doppler boosted emission from the CIB galaxies: A signal and a foreground

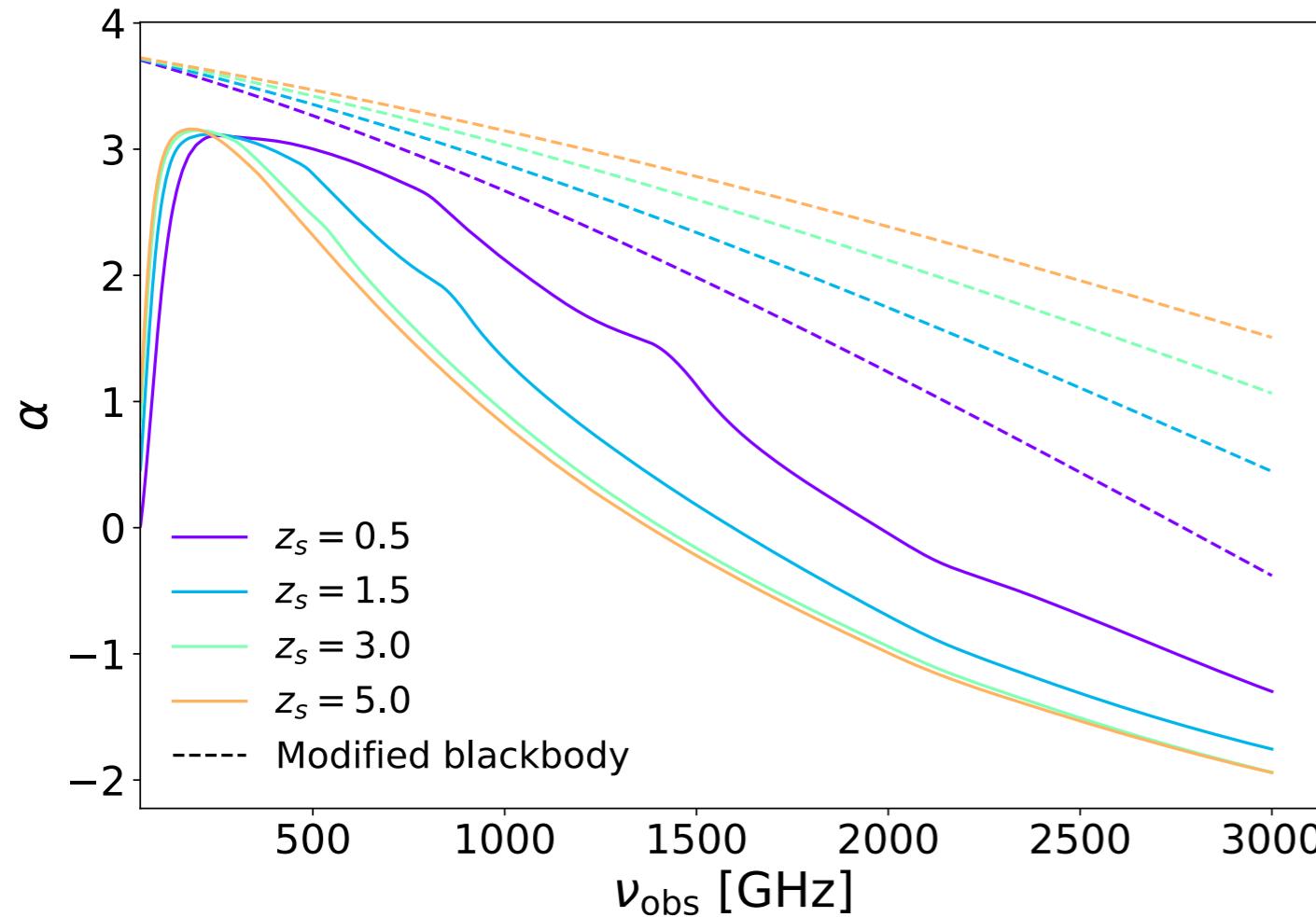
In collaboration with: Emmanuel Schaan & Simone Ferraro

Analogous to kSZ



$$\frac{\Delta I(\nu_0)}{I(\nu_0)} \equiv \frac{I^{\text{obs}}(\nu_0) - I^{\text{obs}}(\nu_0)|_{\beta=0}}{I^{\text{obs}}(\nu_0)|_{\beta=0}} = \beta \left(3 - \frac{d \ln I^{\text{obs}}(\nu_0)}{d \ln \nu_0} \right) \rightarrow \alpha$$

Preliminary results!



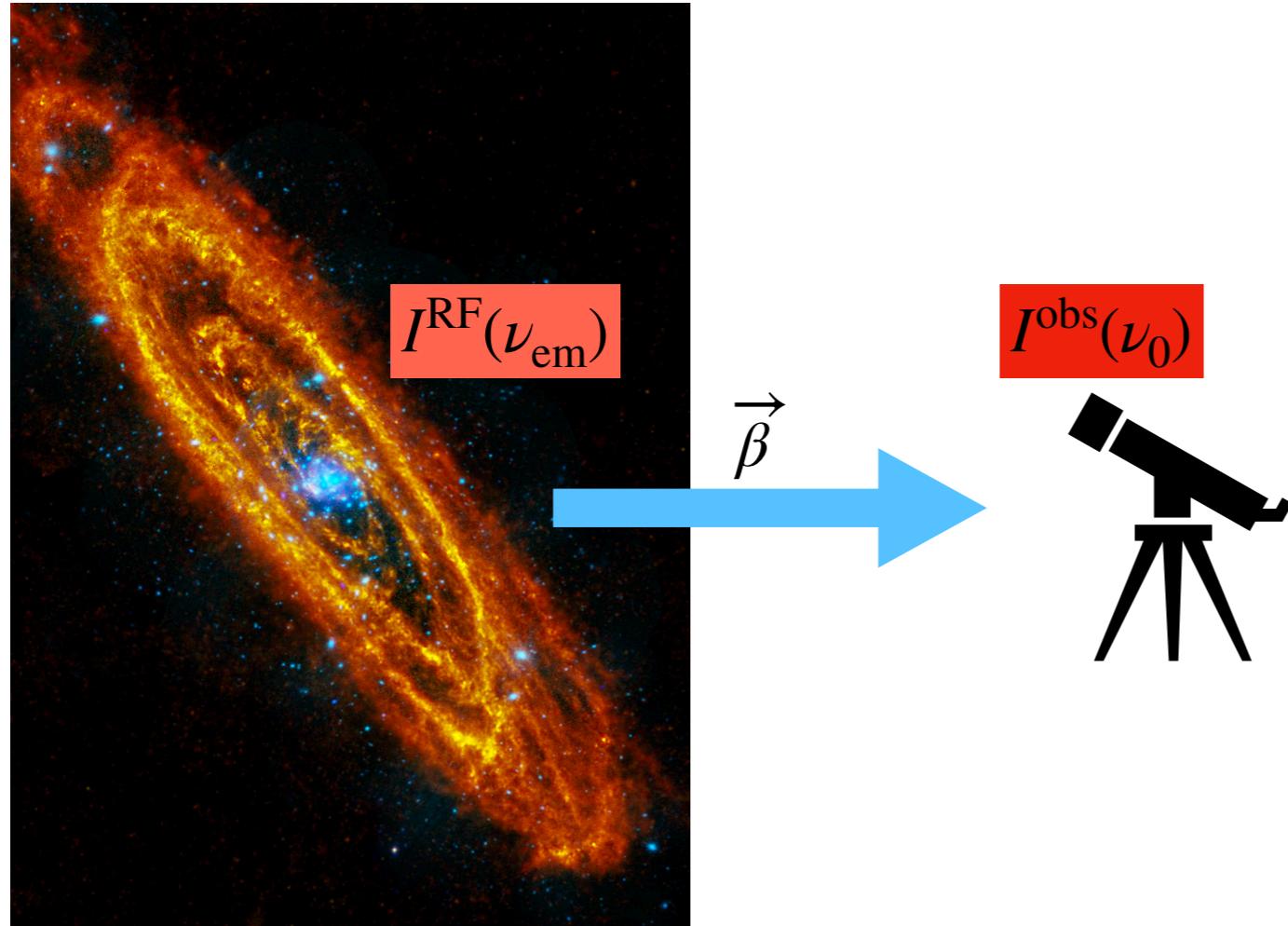
CIB exp	Galaxy exp	SNR
Planck 545 (857) GHz	CMASS	0.05 (0.19)
	DESI-ELG	0.70 (1.78)
	DESI-LRG	0.35 (0.99)
CCAT-Prime 545 (857) GHz	CMASS	1.87 (6.48)
	DESI-ELG	23 (52)
	DESI-LRG	12 (31)

SNR on $C_{\ell}^{\Delta I_{\nu_0} q_{\gamma}}$

Velocity weighted density field

$$\frac{\Delta I(\nu_0)}{I(\nu_0)} \equiv \frac{I^{\text{obs}}(\nu_0) - I^{\text{obs}}(\nu_0)|_{\beta=0}}{I^{\text{obs}}(\nu_0)|_{\beta=0}} = \beta \left(3 - \frac{d \ln I^{\text{obs}}(\nu_0)}{d \ln \nu_0} \right) \rightarrow \alpha$$

Signal & foreground!



- Signal:
 - ♦ Can estimate β
 - ♦ Potential to constrain f_{NL} !
 - ♦ kSZ: $\frac{\Delta T}{T} = \alpha \tau \beta$
 - ♦ Here: $I(\nu_0)$ calibratable
- As foreground: contaminant to kSZ!

$$\frac{\Delta I(\nu_0)}{I(\nu_0)} \equiv \frac{I^{\text{obs}}(\nu_0) - I^{\text{obs}}(\nu_0)|_{\beta=0}}{I^{\text{obs}}(\nu_0)|_{\beta=0}} = \beta \left(3 - \frac{d \ln I^{\text{obs}}(\nu_0)}{d \ln \nu_0} \right) \rightarrow \alpha$$

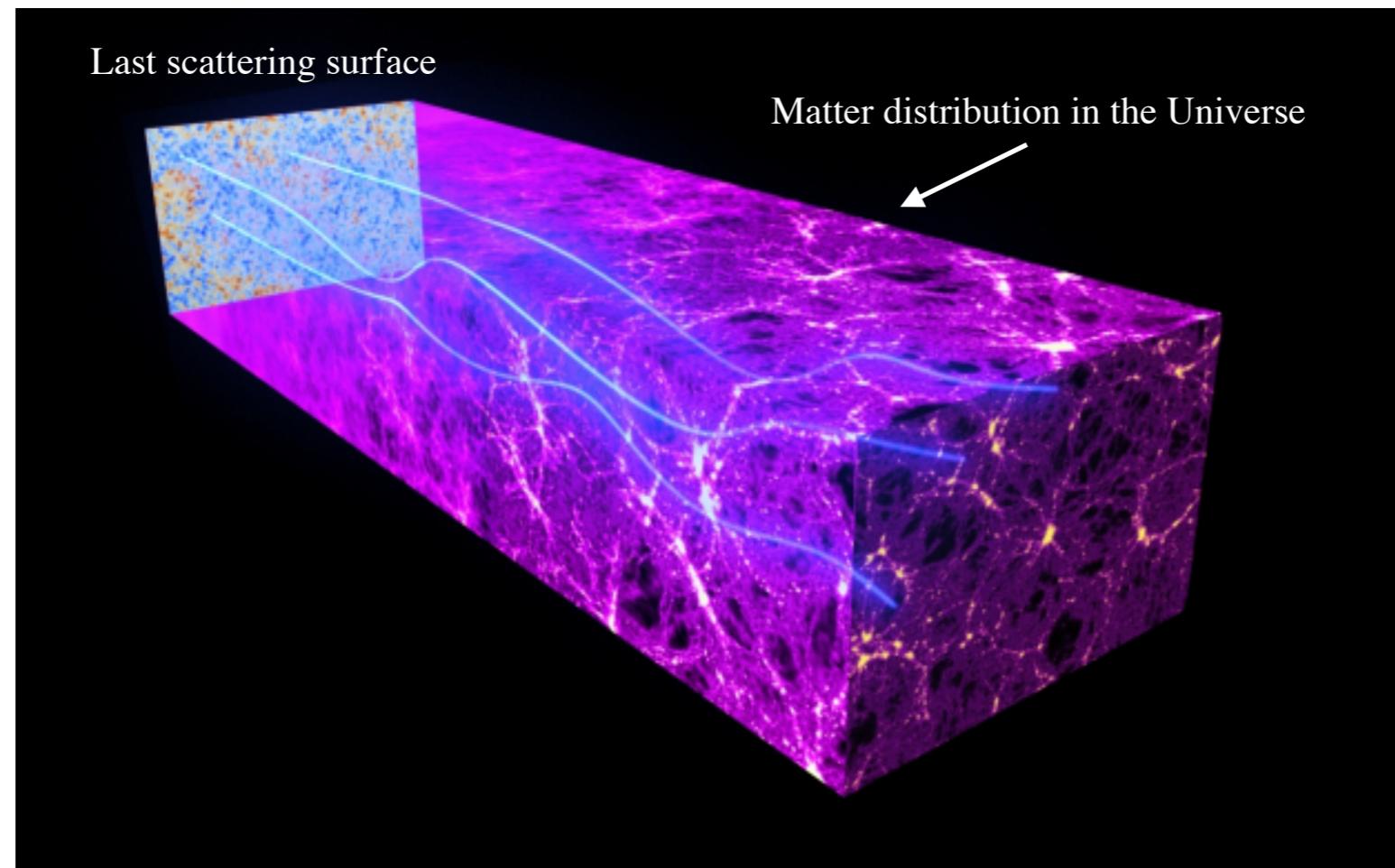
Weak lensing of the CMB: a global minimum variance quadratic estimator

In collaboration with: Yacine Ali-Haïmoud, Julien Carron, Antony Lewis, Mat Madhavacheril

Phys. Rev. D103, 083524 (2021)

Weak lensing of the CMB

- Distribution of the foreground matter fluctuations deflects CMB photons
- What we see is a distorted CMB map
- Reconstructing lensing potential: projected matter field



Quadratic estimators

$$\langle x^0(\mathbf{l})x^0(\mathbf{l}') \rangle \equiv (2\pi)^2 \delta(\mathbf{l} - \mathbf{l}') C_\ell^0 \quad \xrightarrow[\text{lensing}]{\text{No}} \quad \text{Different multipoles uncorrelated}$$

$x^0 = T, E, B$

$$\langle x(\mathbf{l})x'(\mathbf{l}') \rangle_{\text{fixed } \phi} = f_\alpha(\mathbf{l}, \mathbf{l}') \phi(\mathbf{L}) \quad \xrightarrow{\text{lensing}} \quad \text{Lensing induces correlations between different multipoles!}$$

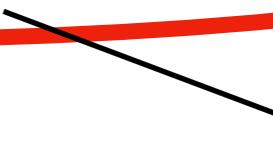
$$\mathbf{L} = \mathbf{l} + \mathbf{l}' \quad \mathbf{l} \neq -\mathbf{l}' \quad x, x' = T, E, B$$

$$\alpha = \{TT, TE, EE, TB, EB, BB\}$$

$$\phi(\mathbf{L}) \propto \int_{\mathbf{l} \neq \mathbf{l}'} F(\mathbf{l}, \mathbf{l}') x(\mathbf{l}) x'(\mathbf{l}')$$

- Appropriate average of pairs of multipoles can be used to estimate the deflection field!
- Pairs of multipoles => quadratic estimator!

Several Quadratic Estimators of the CMB weak lensing

- Hu and Okamoto (2002): HO02
 - Okamoto and Hu (2003): OH03
 - Global minimum variance estimator: GMV
 - Suboptimal quadratic estimator: SQE
- 
- Used in the final data analysis

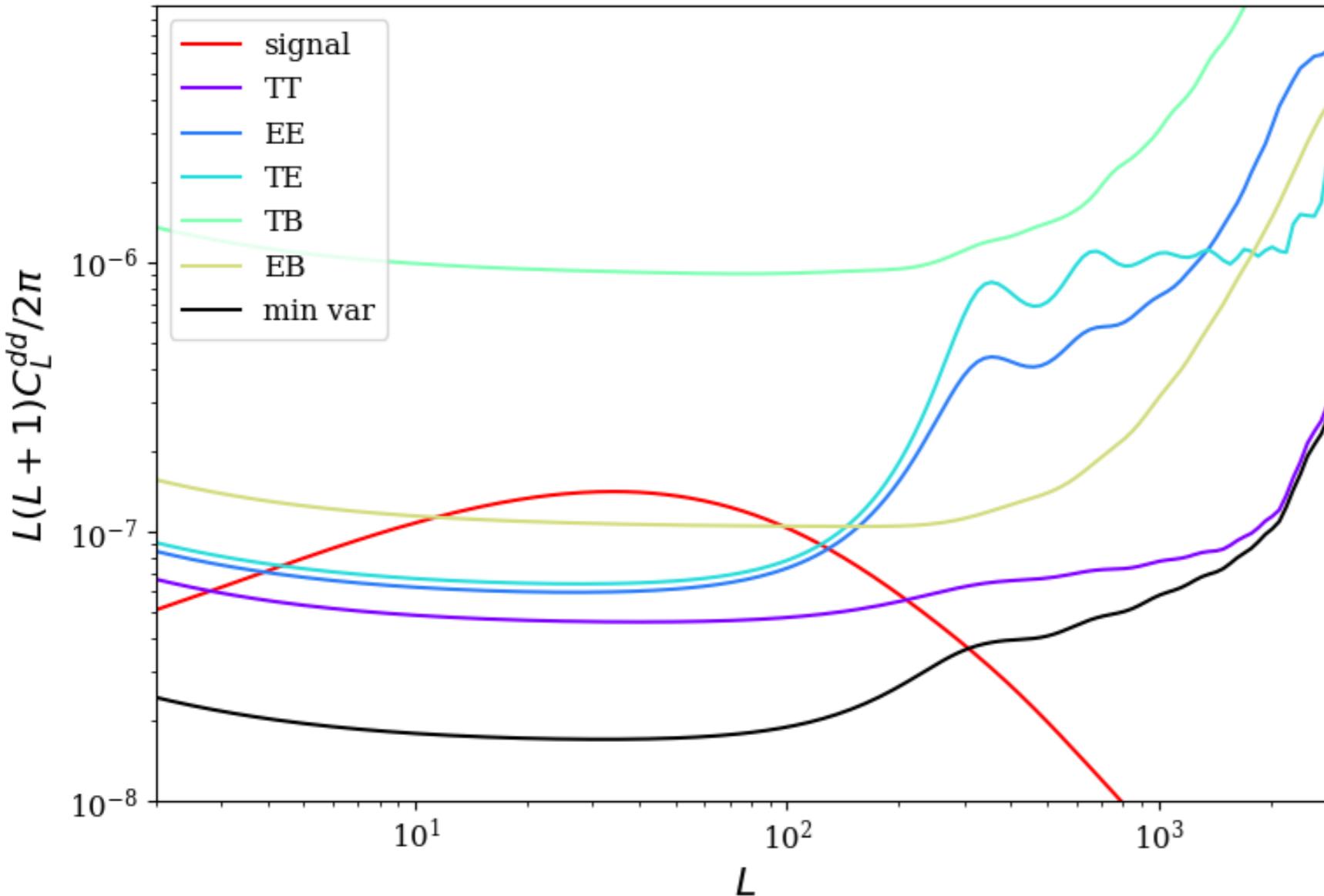
HO02

$$\hat{\phi}(\mathbf{L}) \propto \int_{\mathbf{l}_1 \neq \mathbf{l}_2} F_{XY}(\mathbf{l}_1, \mathbf{l}_2) X(\mathbf{l}_1) Y(\mathbf{l}_2)$$

- 5 minimum variance estimators: $\hat{\phi}_{TT}$, $\hat{\phi}_{EE}$, $\hat{\phi}_{TE}$, $\hat{\phi}_{TB}$, $\hat{\phi}_{EB}$
- Final estimator: minimum variance linear combination of individual estimators

$$\begin{aligned}\hat{\phi}_{HO02} &= w_{TT}\hat{\phi}_{TT} + w_{EE}\hat{\phi}_{EE} + w_{TE}\hat{\phi}_{TE} + w_{TB}\hat{\phi}_{TB} + w_{EB}\hat{\phi}_{EB} \\ w_{TT} + w_{EE} + w_{TE} + w_{TB} + w_{EB} &= 1\end{aligned}$$

HO02: SO-like experiment



- Individual TT, EE, TE, TB, and EB estimators
- MV estimator out of combination of individual estimators
- Temperature dominated data

GMV

- HO02 consider the correlations between different XY pairs **after** integrating over \mathbf{l}_1 and \mathbf{l}_2
- GMV: Account for these correlations at each \mathbf{l}_1 and \mathbf{l}_2
- Less noisy than HO02 and best possible minimum variance quadratic estimator!

$$\phi_{\text{mv}} \propto \int \left(F_{TT} T(\mathbf{l}) T(\mathbf{l}') + F_{EE} E(\mathbf{l}) E(\mathbf{l}') + F_{TE} T(\mathbf{l}) E(\mathbf{l}') + F_{TB} T(\mathbf{l}) B(\mathbf{l}') + F_{EB} E(\mathbf{l}) B(\mathbf{l}') \right)$$

GMV

GMV

$$\hat{\phi}(\mathbf{L}) = \int_{\mathbf{l}_1 \neq \mathbf{l}_2} X^i(\mathbf{l}_1) \Xi_{ij}(\mathbf{l}_1, \mathbf{l}_2) X^j(\mathbf{l}_2),$$

$$[\boldsymbol{\Xi}(\mathbf{l}_1, \mathbf{l}_2)] = \frac{\lambda(L)}{2} [\mathbf{C}_{l_1}]^{-1} [\mathbf{f}(\mathbf{l}_1, \mathbf{l}_2)] [\mathbf{C}_{l_2}]^{-1}$$

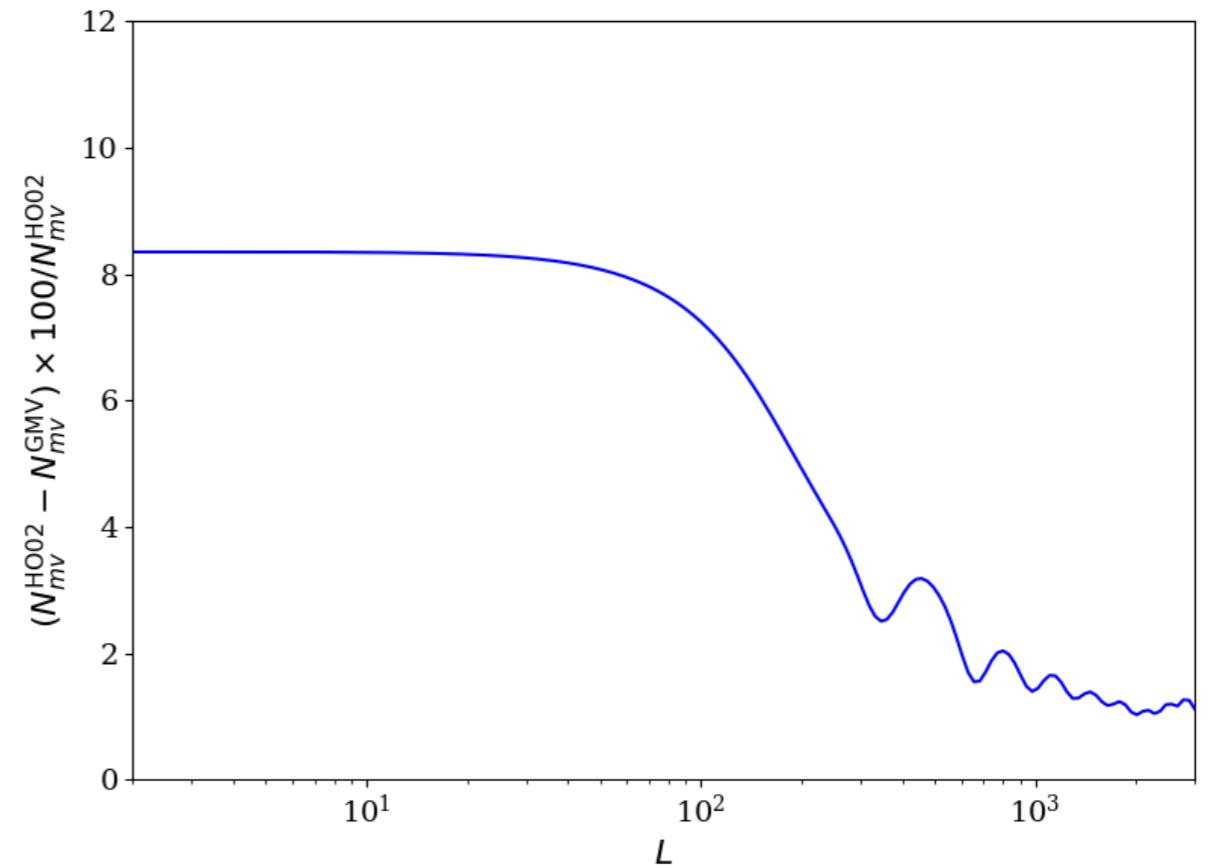
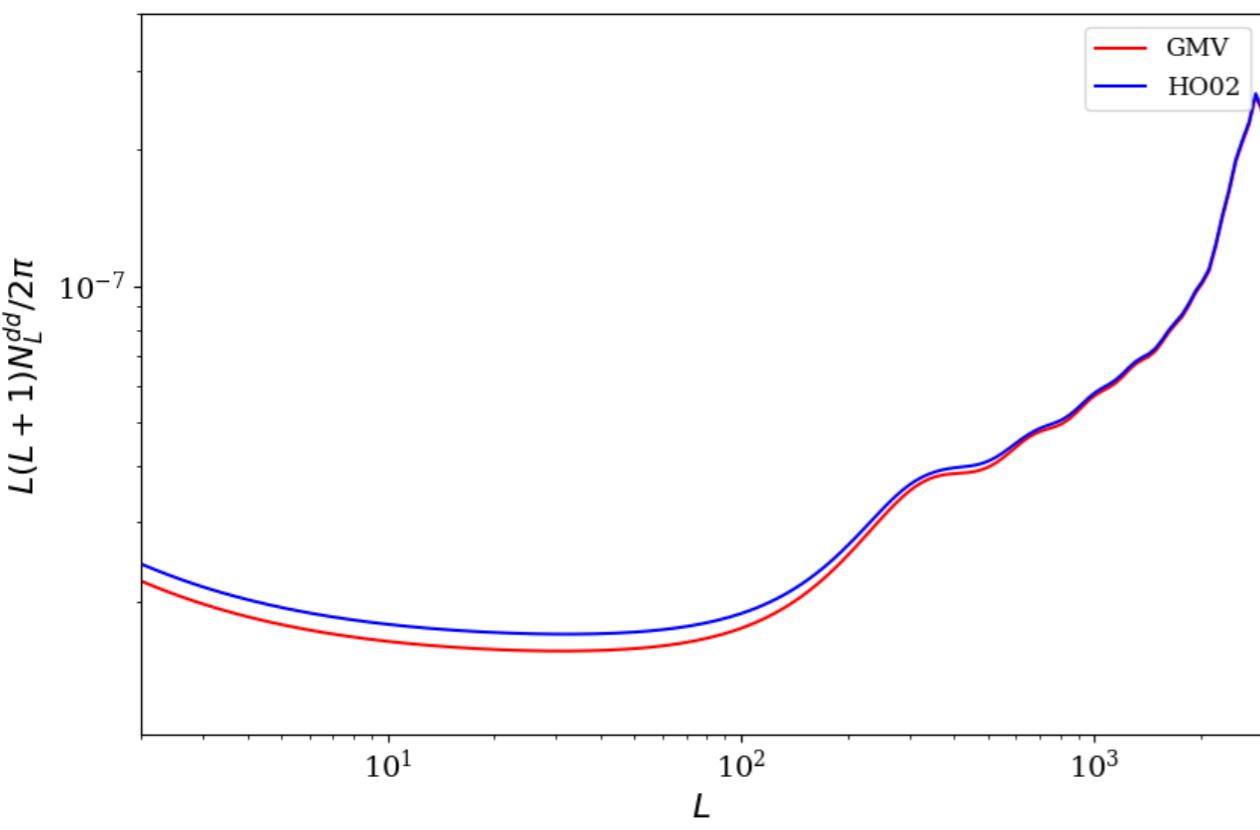
HO02

$$\int_{\mathbf{l}_1 \neq \mathbf{l}_2} F_{XY}(\mathbf{l}_1, \mathbf{l}_2) X(\mathbf{l}_1) Y(\mathbf{l}_2)$$

$$F_{XY}(\mathbf{l}_1, \mathbf{l}_2) = \lambda_{XY}(L) \frac{f_{XY}(\mathbf{l}_1, \mathbf{l}_2)}{(1 + \delta_{XY}) C_{l_1}^{XX} C_{l_2}^{YY}}$$

- \mathbf{C}_l and $\mathbf{f}(\mathbf{l}_1, \mathbf{l}_2)$: 3 x 3 symmetric matrices
- Separable in \mathbf{l}_1 and \mathbf{l}_2 without any approximations! => FFT
- Previously derived, but erroneously described as equivalent to HO02 estimator!!

GMV: SO-like experiment



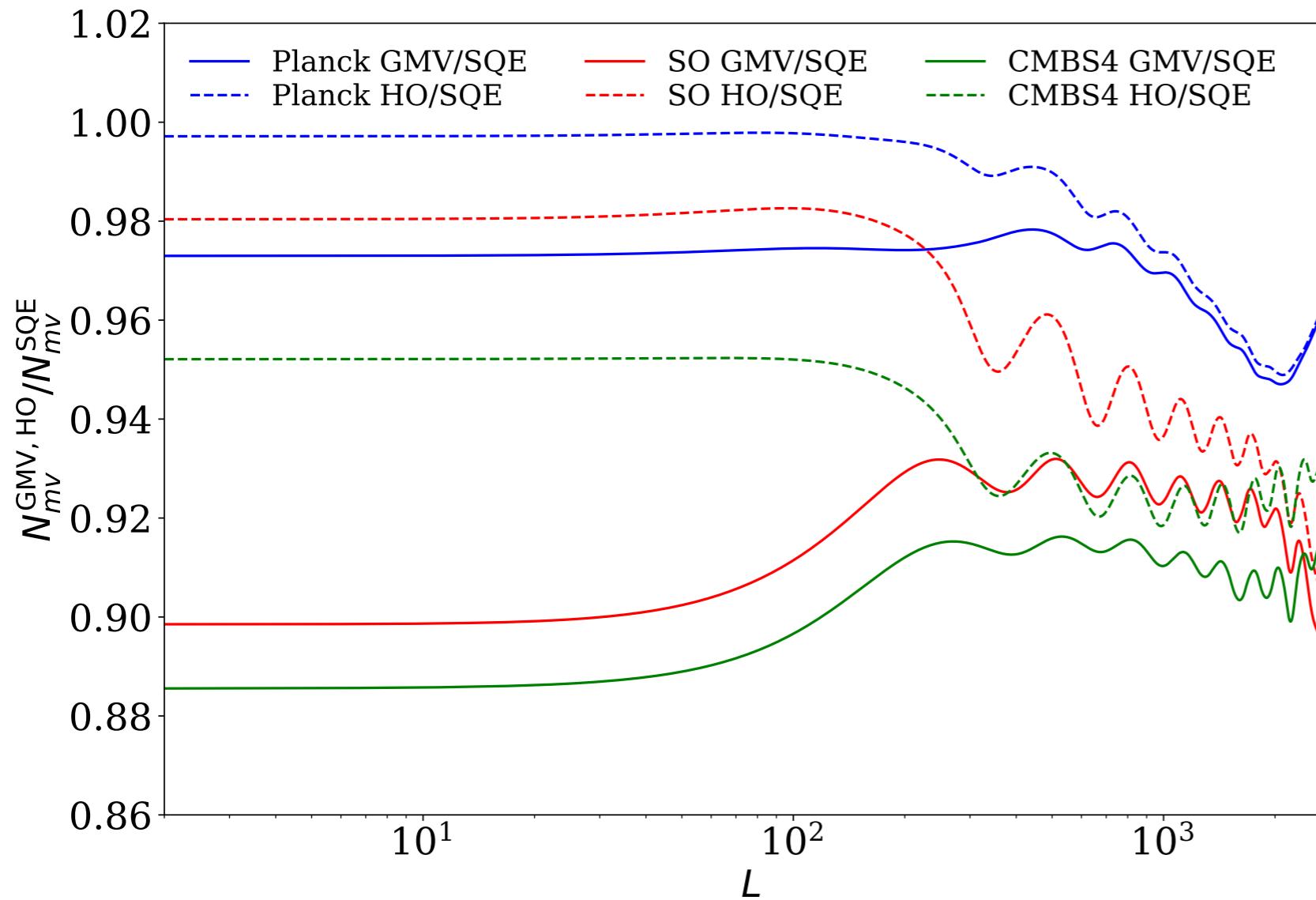
- 8-10% smaller noise than HO02 on small L
- More information out of the same maps!

SQE

$$\hat{\phi}(\mathbf{L}) = \int_{\mathbf{l}_1 \neq \mathbf{l}_2} X^i(\mathbf{l}_1) \Xi_{ij}(\mathbf{l}_1, \mathbf{l}_2) X^j(\mathbf{l}_2), \quad [\boldsymbol{\Xi}(\mathbf{l}_1, \mathbf{l}_2)] = \frac{\lambda(L)}{2} [\mathbf{C}_{l_1}]^{-1} [\mathbf{f}(\mathbf{l}_1, \mathbf{l}_2)] [\mathbf{C}_{l_2}]^{-1}$$

- Planck (2016, 2020) and SPT (2019) use an approximated version: SQE
- $C_l^{TE} = 0$ in \mathbf{C}_l
- Allows to deal with cut-sky setup with lower computational cost
- Preserves separability in \mathbf{l}_1 and \mathbf{l}_2
- 3% noise penalty for Planck
- Suboptimal to HO02 as well!

Comparison of all estimators



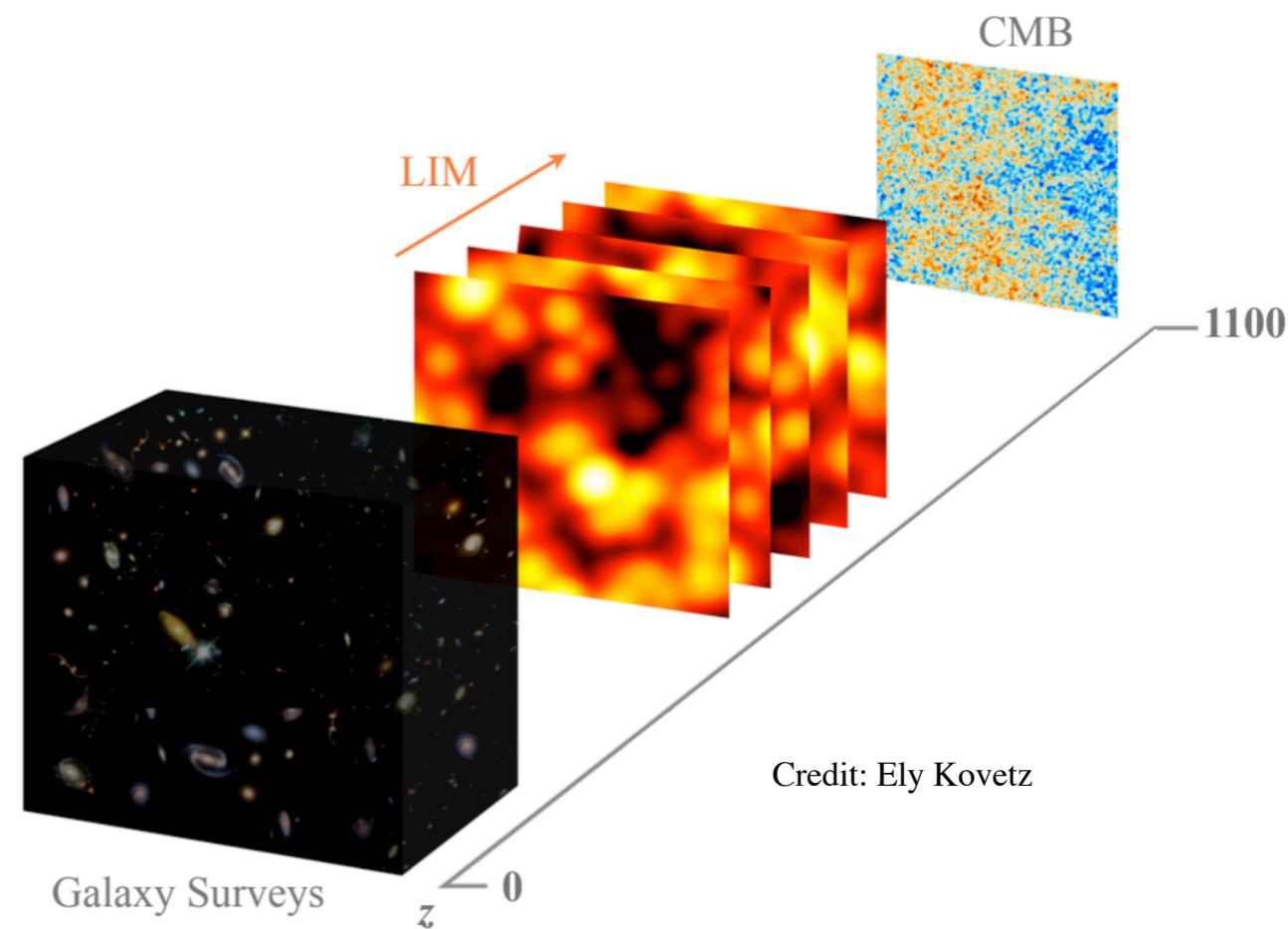
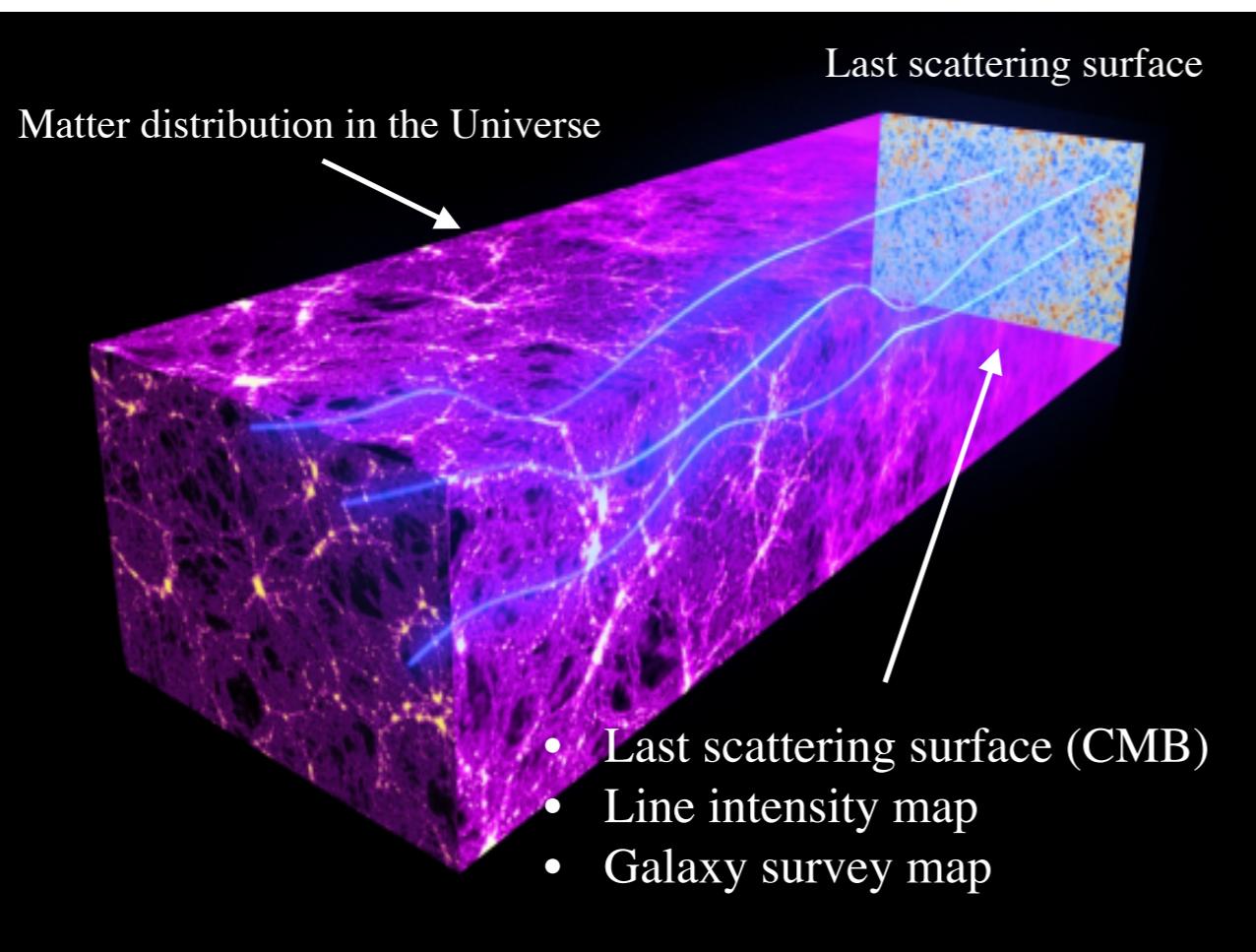
- SQE to GMV difference:
 - 3-6% for Planck-like experiments
 - 11-12% for SO-like experiments
- Should motivate use of full covariance matrix rather than setting $C_l^{TE} = 0$

Application to LIM: interloper-free “LIM-pair” lensing

In collaboration with: Emmanuel Schaan & Anthony Pullen

arXiv:2106.09005

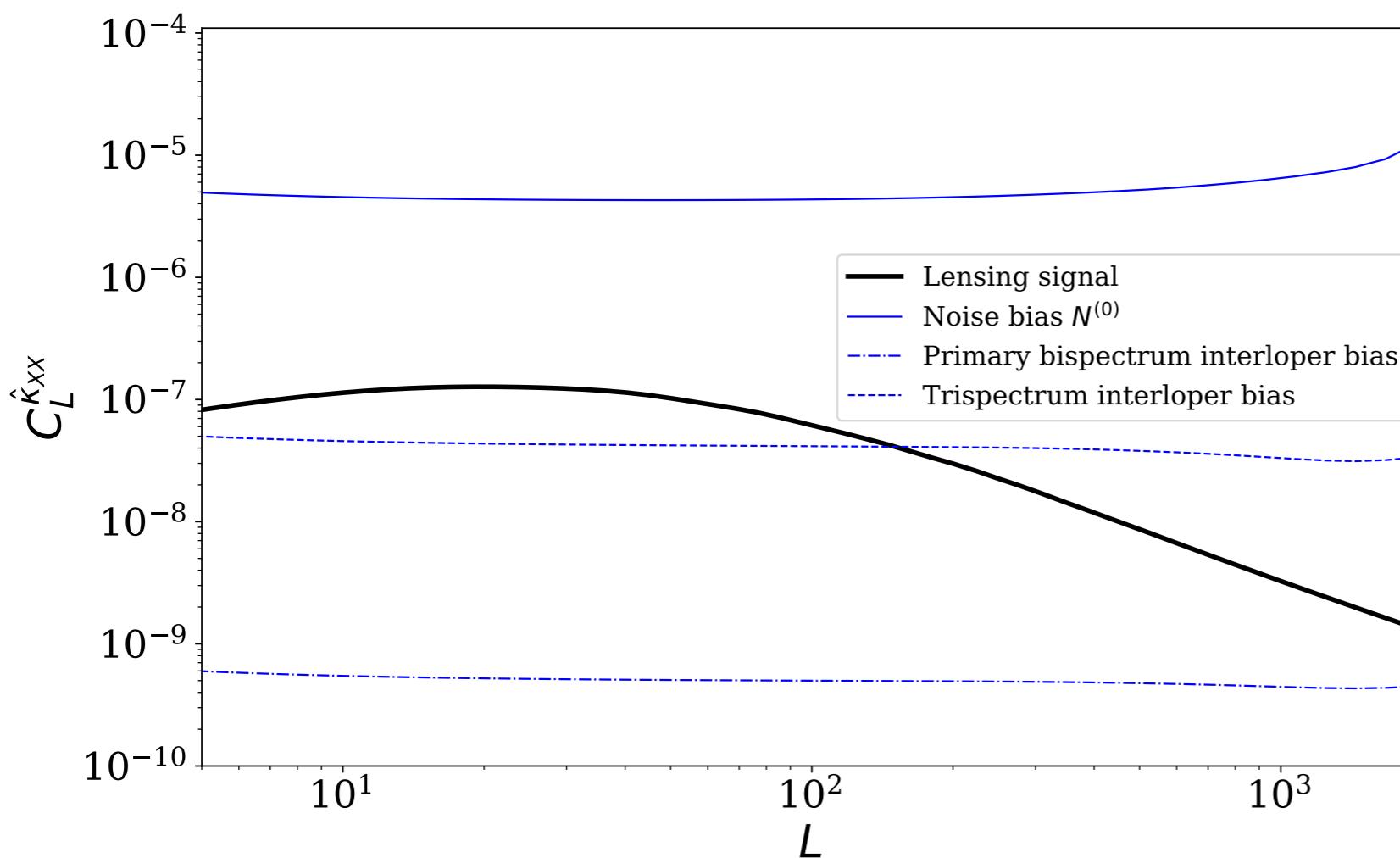
Weak lensing of the CMB/LIM/Galaxies



LIM Lensing: issues!

- Non-linear nature of the LIM biases the inferred lensing from LIM
 - Bias hardened estimators (Foreman et al. 2018)
 - Modifying lensing weights to down-weight mode combinations coupled through nonlinear effects (Schaan et al. 2018)
- Continuum foregrounds like CIB or the Milky Way
 - Avoided by discarding the 3D Fourier modes with low k_{\parallel}
- Interlopers?
 - Have not been addressed for LIM lensing
 - Bias the signal → $C_L^{\kappa\kappa}$

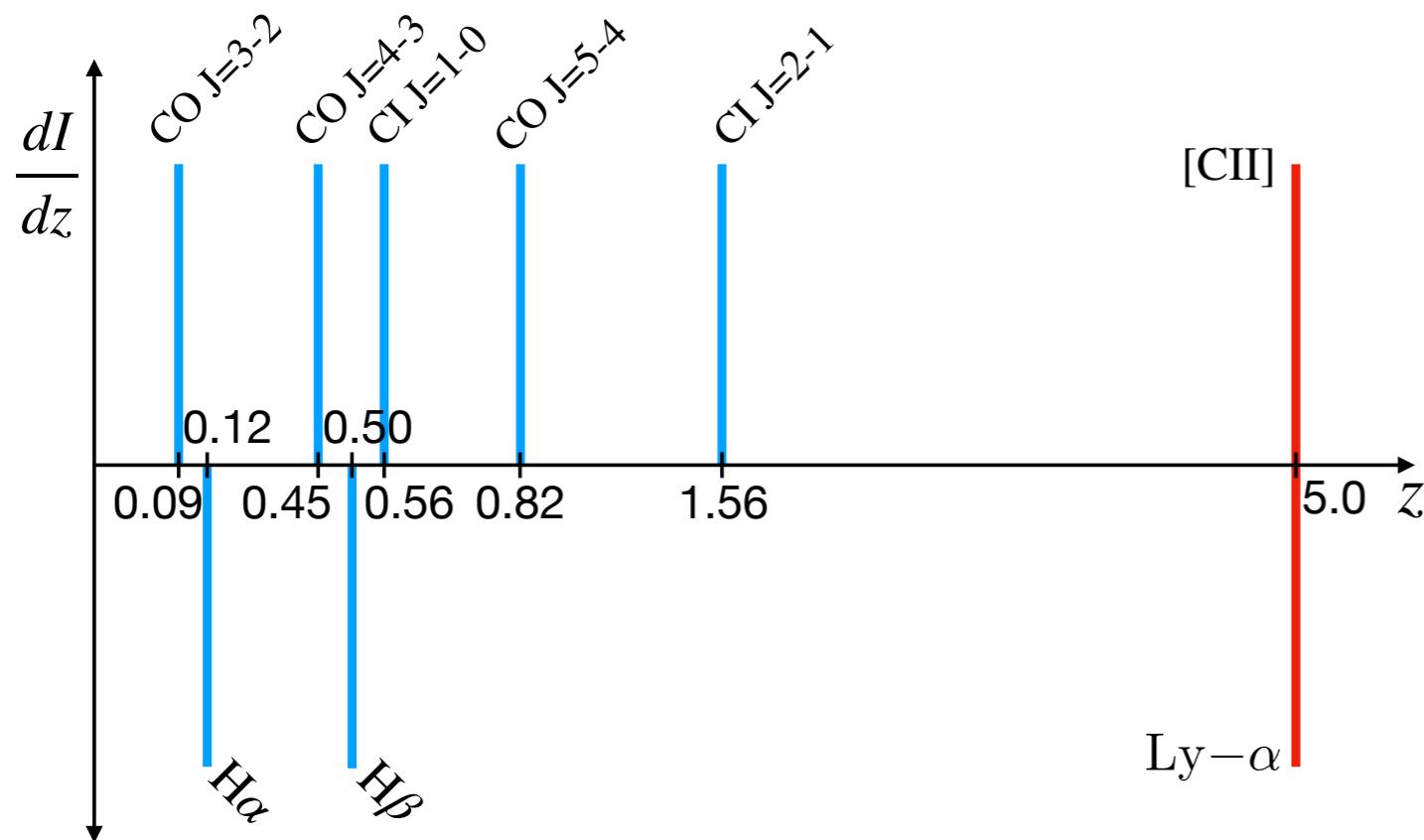
LIM Lensing



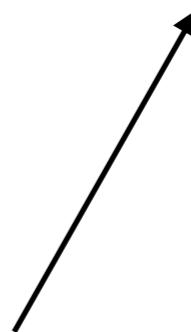
$$X = \text{Ly}-\alpha \text{ at } z = 5$$

- Interloper contamination produces dominant non-Gaussian bias to lensing power spectrum
- Need a new estimator to get rid of the bias!

“LIM-pair” lensing!

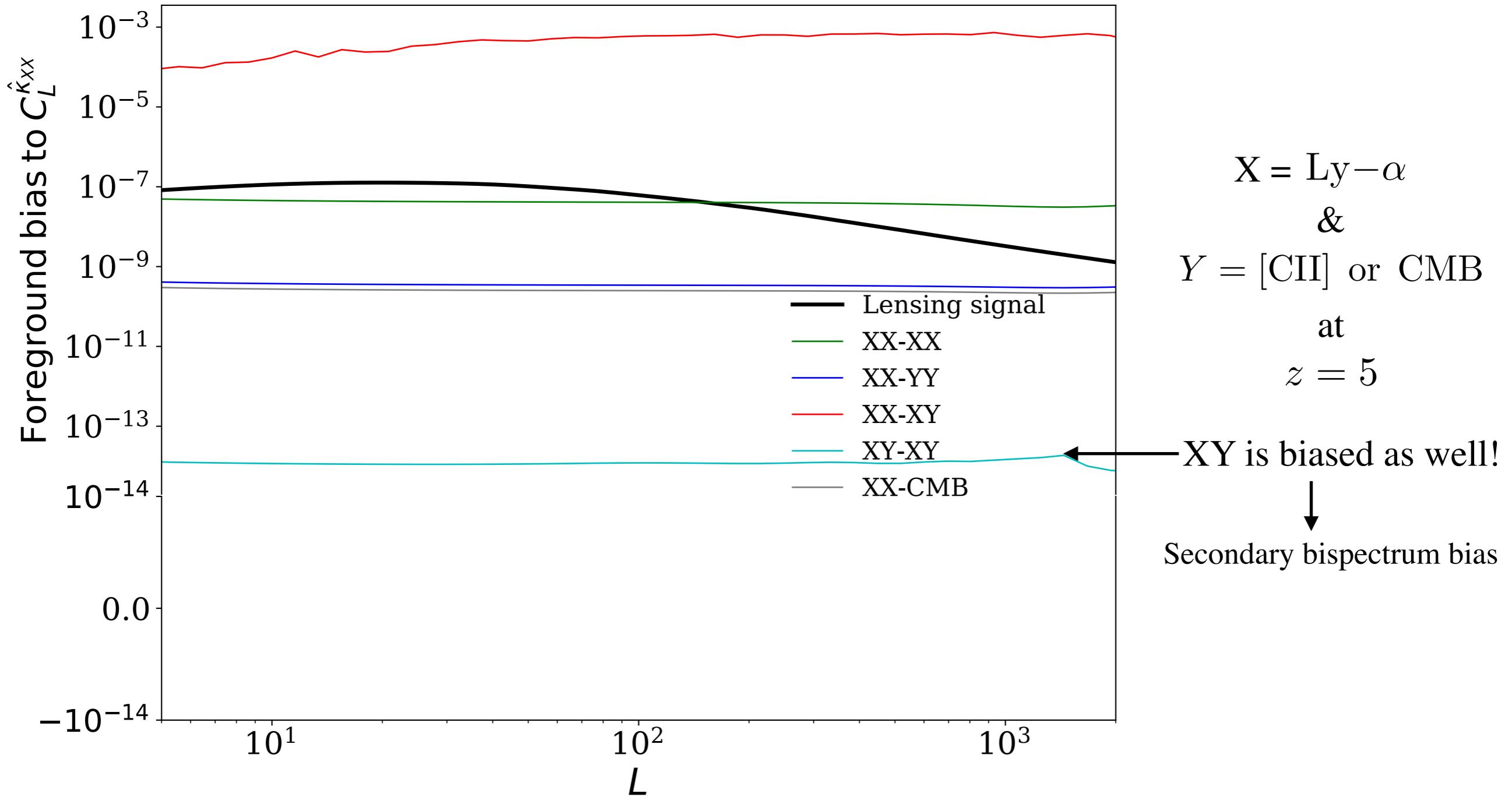


- Choose two target lines at the same redshift
- Only condition: interlopers should not overlap in redshift!

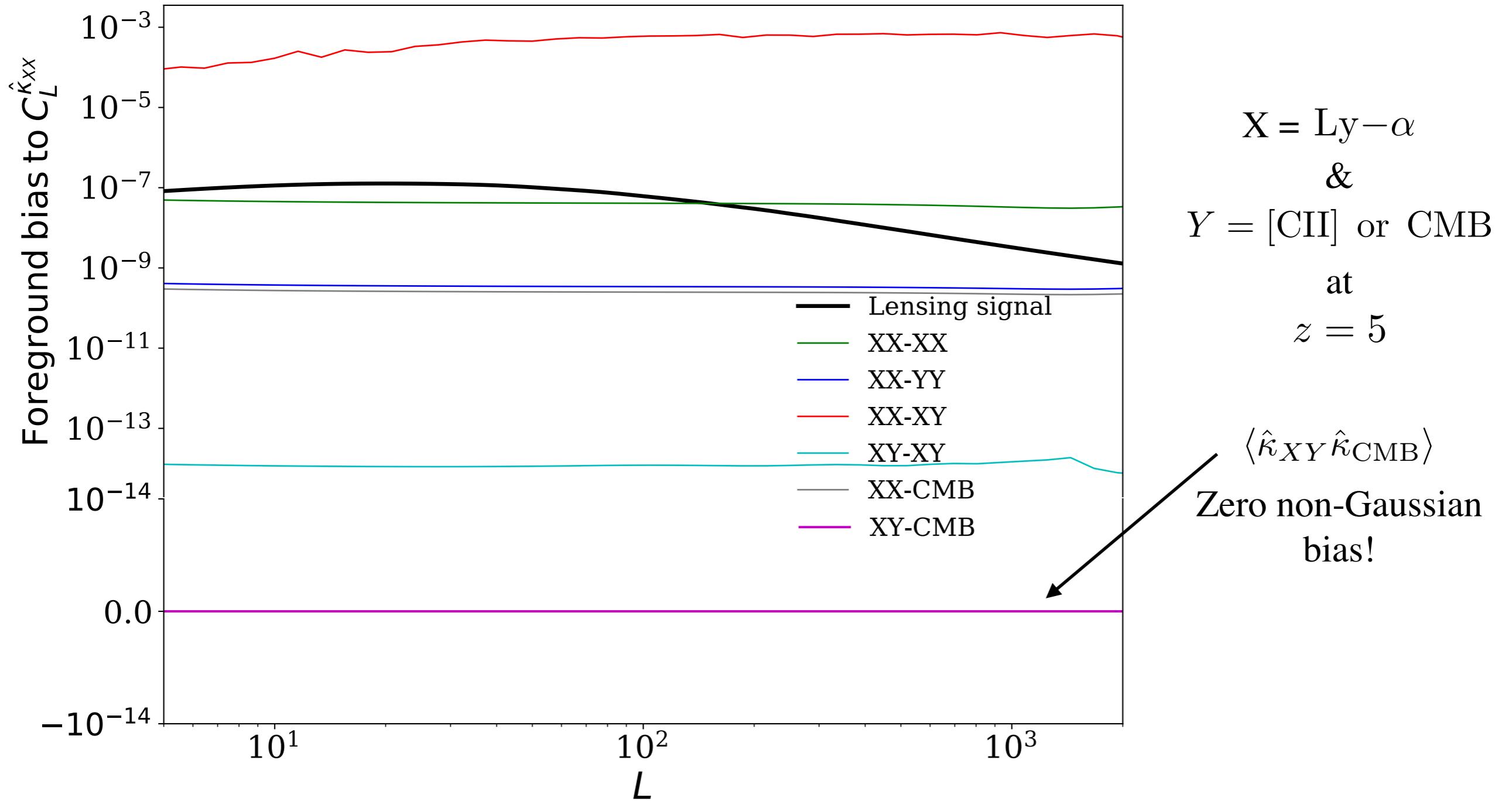


$$\mathcal{K}_{XY} \rightarrow X, Y = [CII], Ly-\alpha, \dots$$

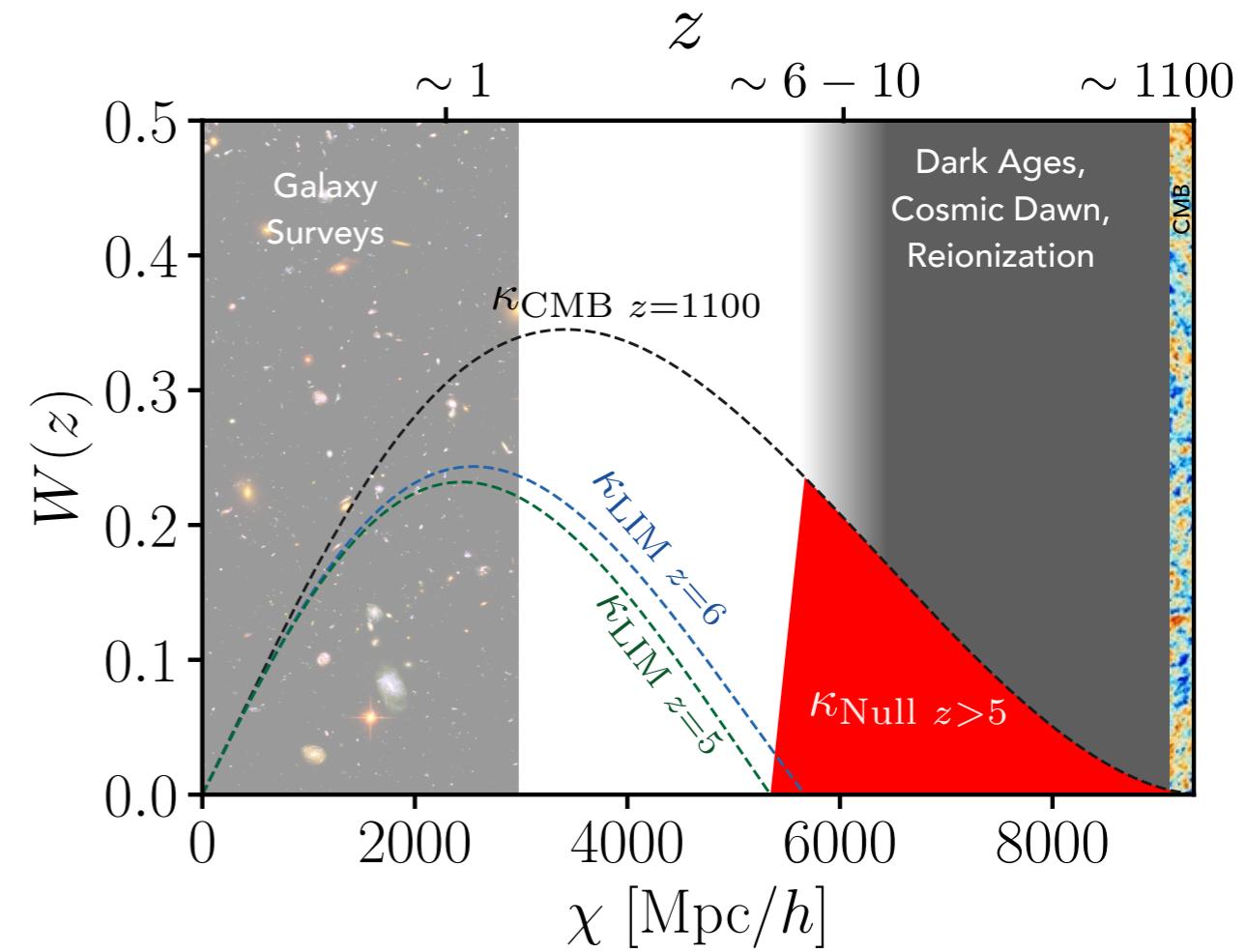
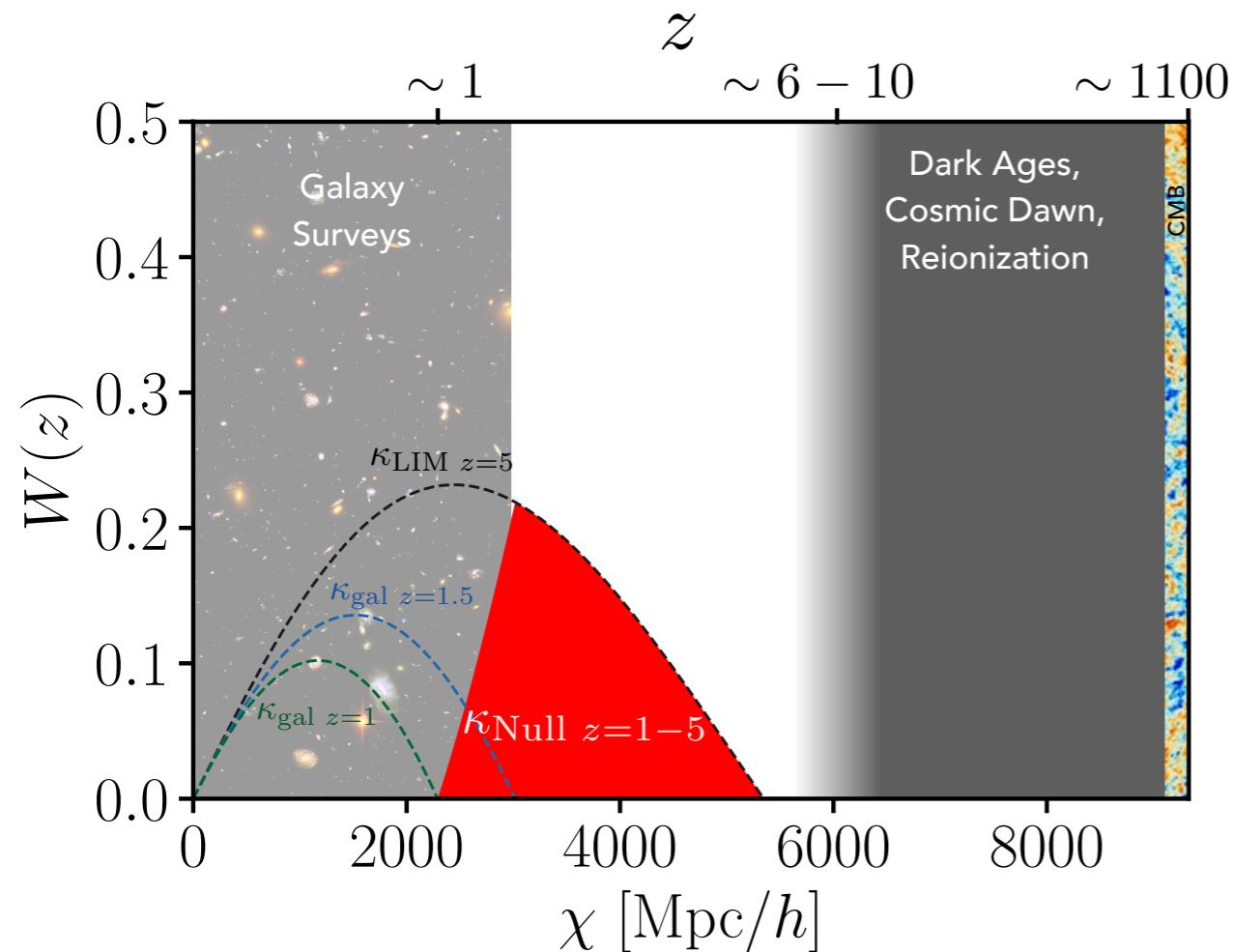
“LIM-pair” lensing!



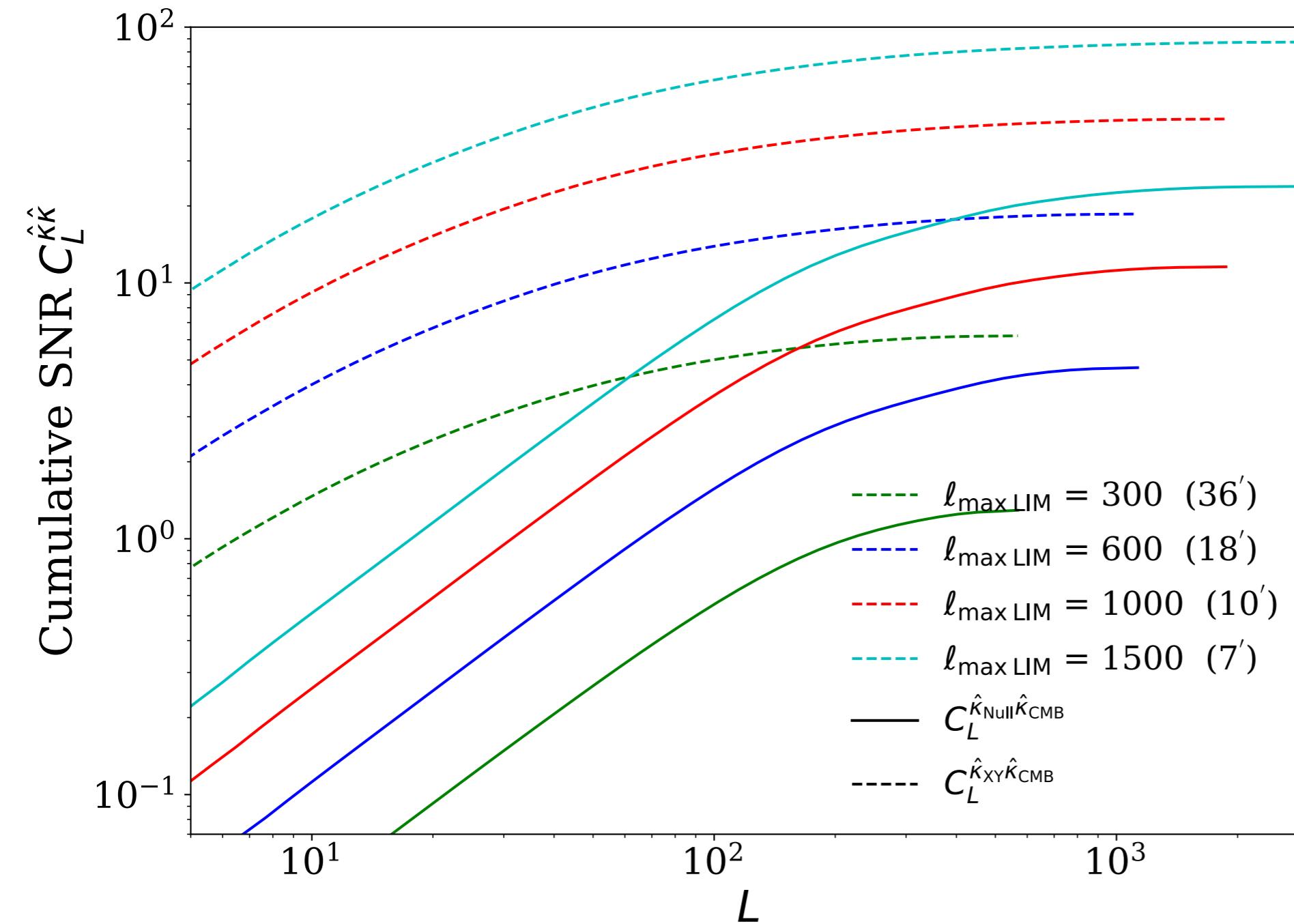
“LIM-pair” lensing!



“LIM-pair” lensing: probing high redshift Universe with nulling technique



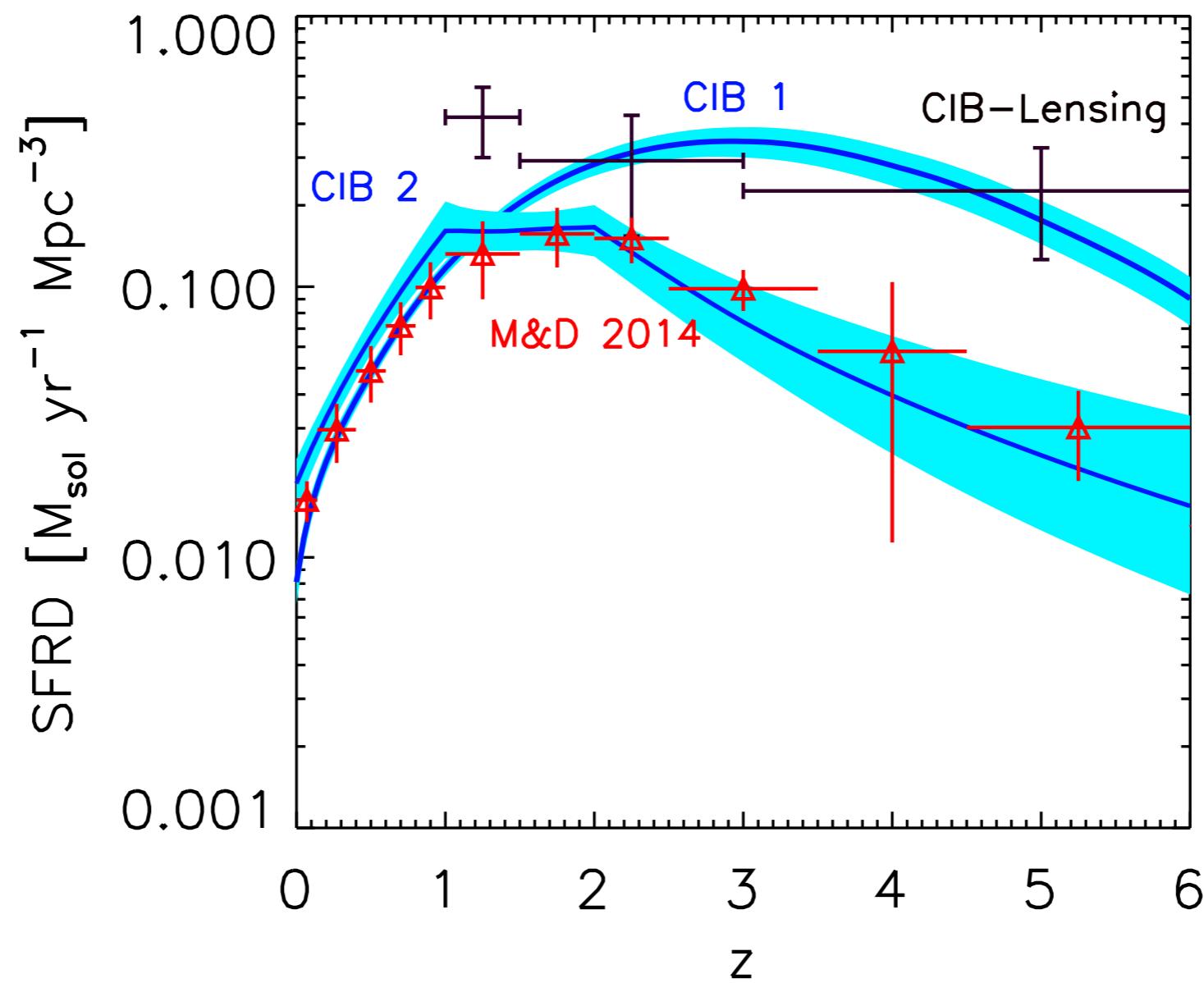
Can we detect this? $C_L^{\hat{k}_{\text{null}} \hat{k}_{\text{CMB}}}$: Yes! (Futuristic!)



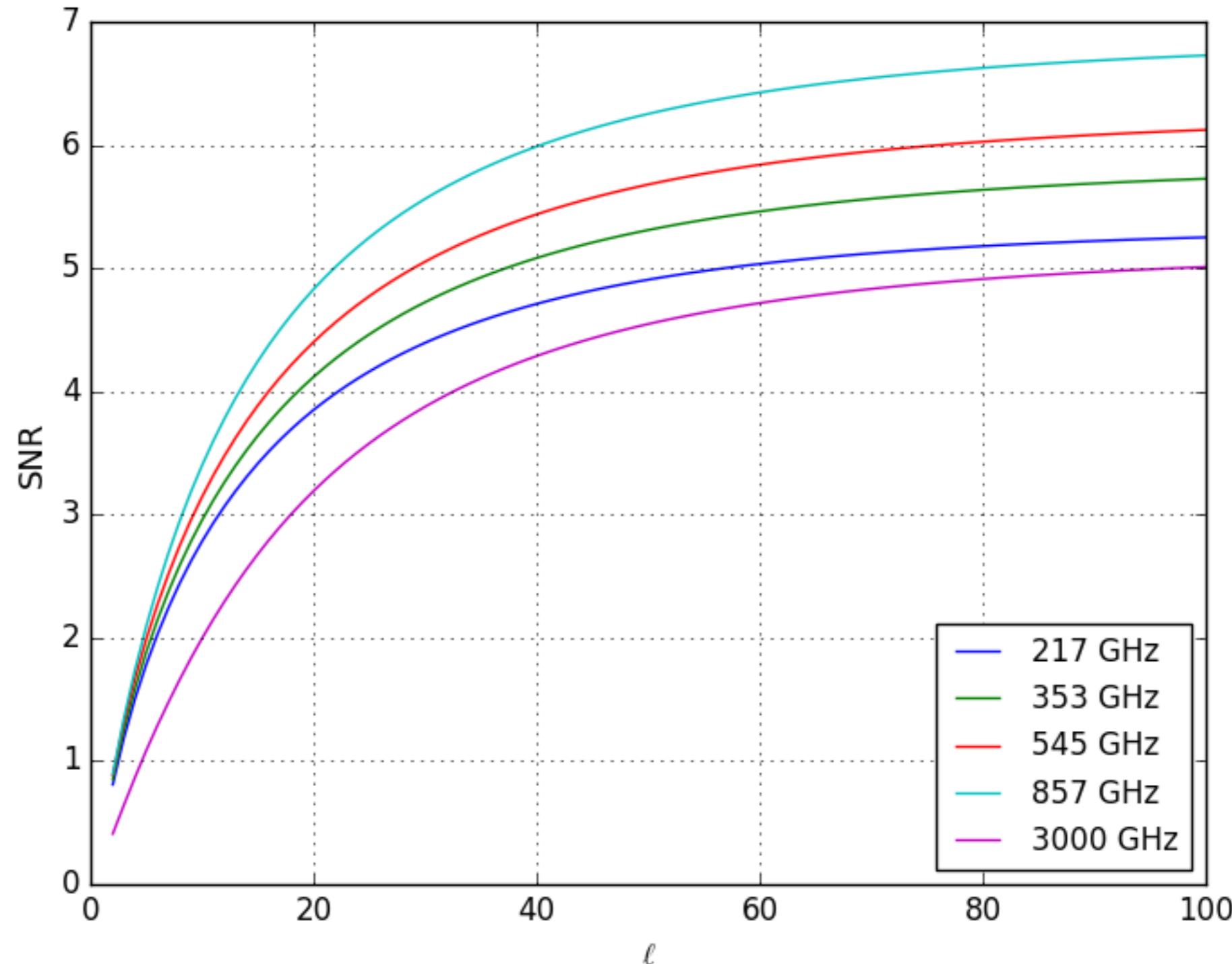
- $f_{\text{sky}} = 40\%$
- Would be possible to detect this signal
- Angular resolution should not be an issue

Thank you!

SFRD from different models/measurements

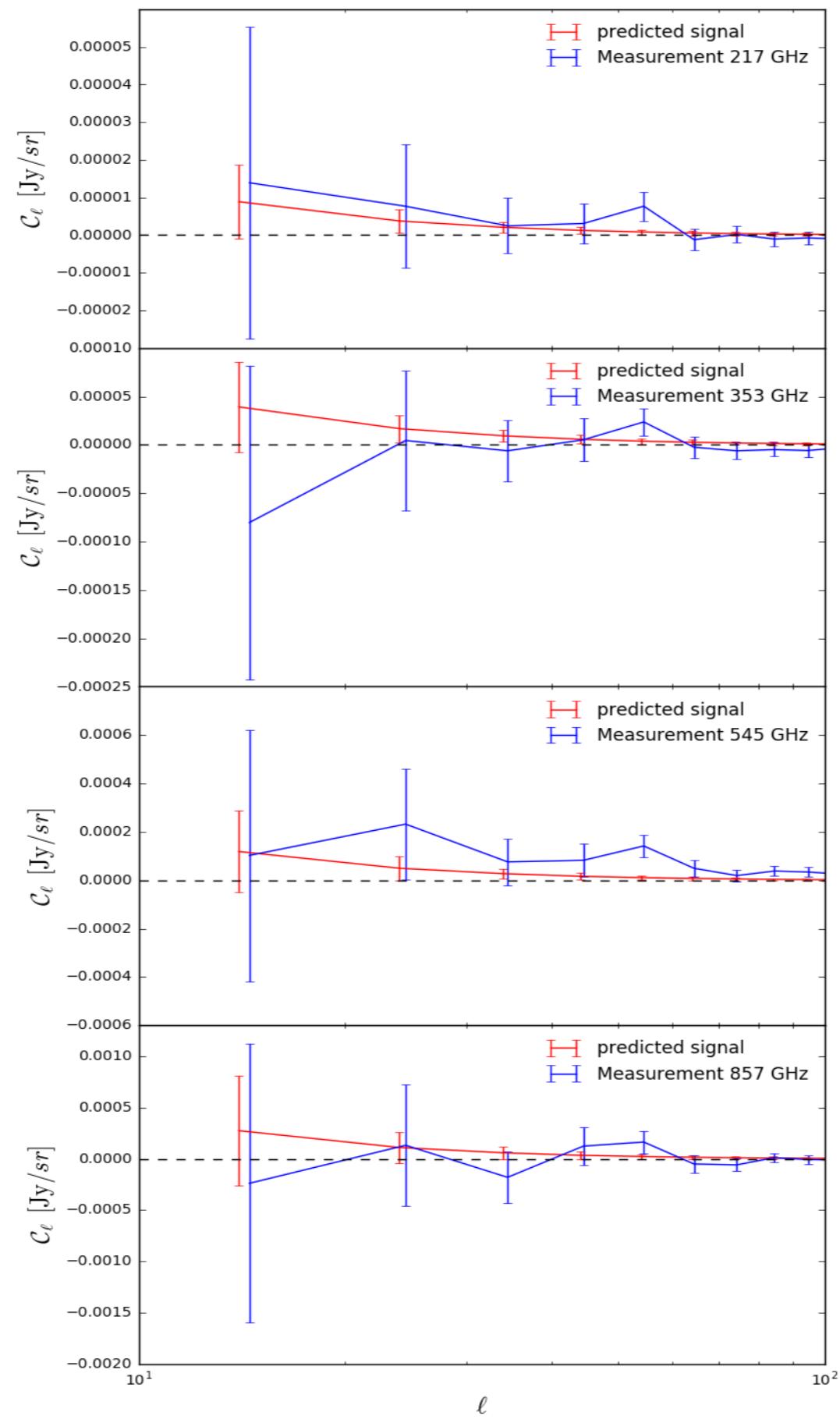


Optimistic: ISW SNR (100% sky, no dust) forecast



ISW SNR (10% dust residuals)

Freq. (GHz)	217	353	545	857	3000
SNR 20% f_{sky}	1.46	1.51	1.41	1.14	0.52
SNR 40% f_{sky}	1.16	1.16	0.99	0.69	0.27
SNR 60% f_{sky}	0.92	0.90	0.74	0.49	0.18
SNR 70% f_{sky}	0.80	0.78	0.63	0.42	0.16
SNR 80% f_{sky}	0.59	0.57	0.45	0.30	0.11



Experimental specs

Experiment	ℓ_{\max}	Δ_T $\mu\text{K-arcmin}$	Δ_P $\mu\text{K-arcmin}$	σ arcmin
<i>Planck</i>	3000	35.0	60.0	5.0
SO	3000	8.0	$8.0\sqrt{2}$	1.4
CMBS4	3000	1.0	$1.0\sqrt{2}$	1.0

TABLE II: Experimental specifications used in this work.

$$\ell_{\max}^T = \ell_{\max}^P$$