

# unWISE galaxies x CMB Lensing

new results from unWISE x Planck Lensing  
and towards unWISE x ACT DR6 Lensing

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*work with Alex Krolewski, Blake Sherwin, Simone Ferraro, Niall MacCrann, Frank Qu and others*

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CMB-S4 collaboration meeting, August 1 2023, Stanford

## What we plan to do

- Measure (primarily)  $S_8$  using galaxy - CMB lensing cross-correlations

## What data we are using

- using unWISE catalog
- CMB lensing reconstructions from Planck and (soon) from ACT

## Why this is interesting

- long standing  $S_8$  tension
- previously unWISE  $\times$  Planck lensing found low  $S_8$  (Krolewski *et al.*, 2021)

## How we are doing it

- model  $C_\ell^{gg}$  and  $C_\ell^{\kappa g}$  to break  $b_g - \sigma_8$  degeneracy

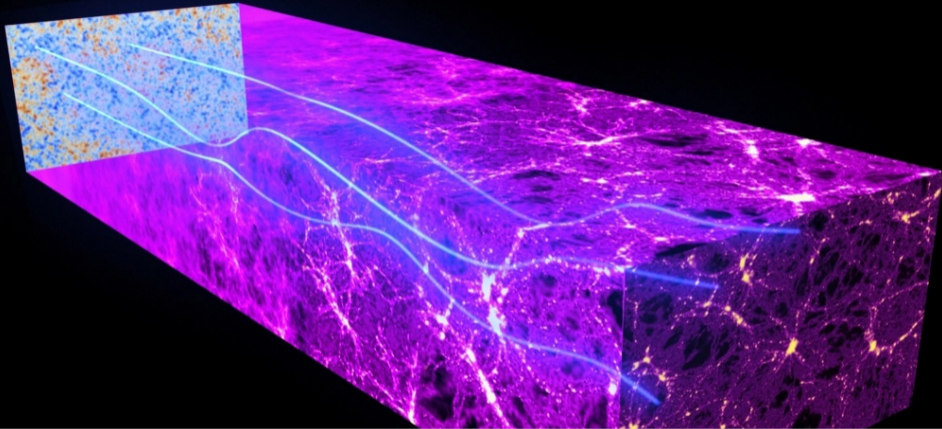


## Two possible resolutions?

- scale dependent suppression of power
  - non-linear structure growth
  - (stronger than expected) baryon feedback
  - ...
- redshift dependent suppression of power
  - dark energy evolution
  - ....

Image Credit: Abdalla *et al.* (2022)

# Introduction to CMB lensing

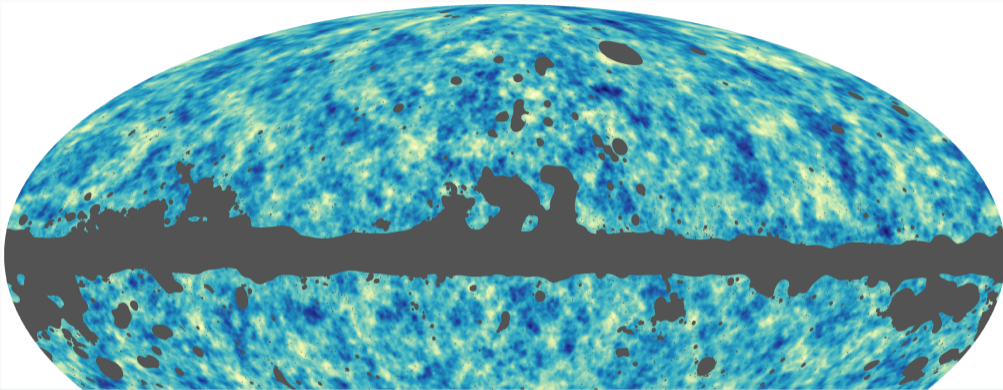


Lensing probes projected matter density

$$\phi \sim \int_0^{\chi^*} W_\phi(\chi) \delta_m(\hat{n}\chi) d\chi$$



# Lensing reconstruction

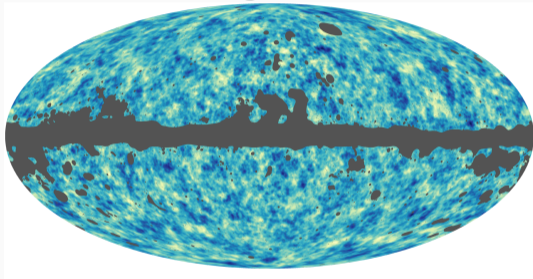


**Reconstruct lensing from off-diagonal correlations in CMB**

$$\hat{\phi}(L) \sim \int d^2I \tilde{\Theta}(I) \tilde{\Theta}(I - L)$$

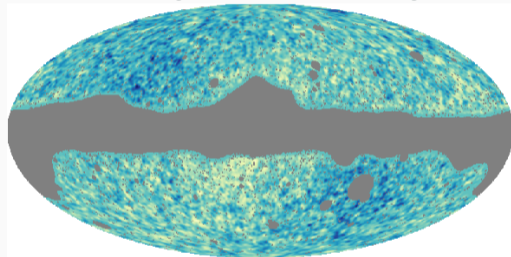
# Cross-correlation with galaxies

CMB Lensing reconstruction



Planck or ACT

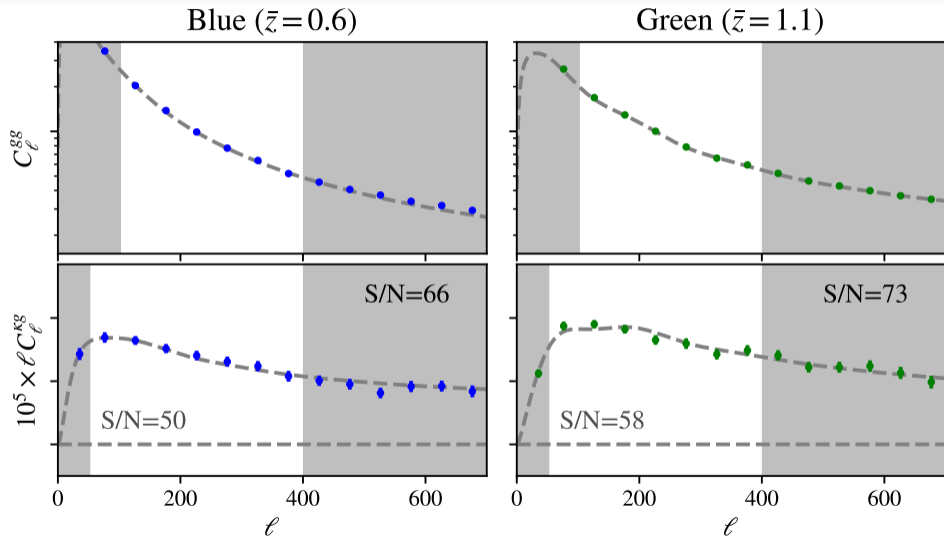
Galaxy number density



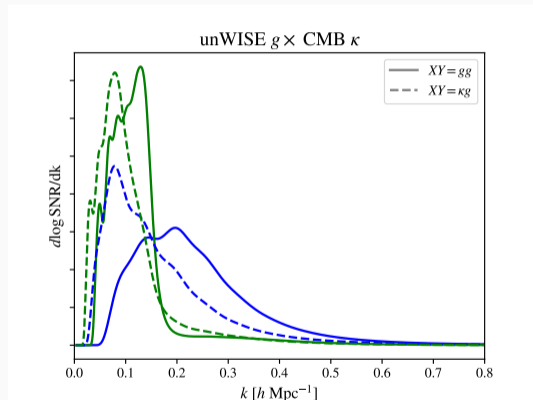
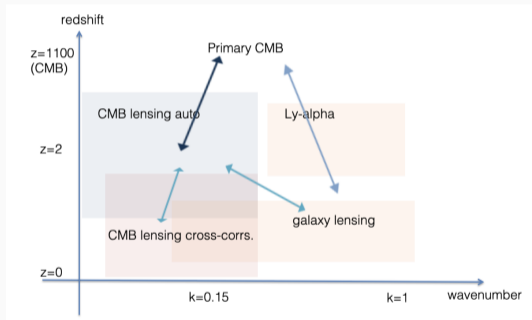
×

here unWISE

# The cross-correlation



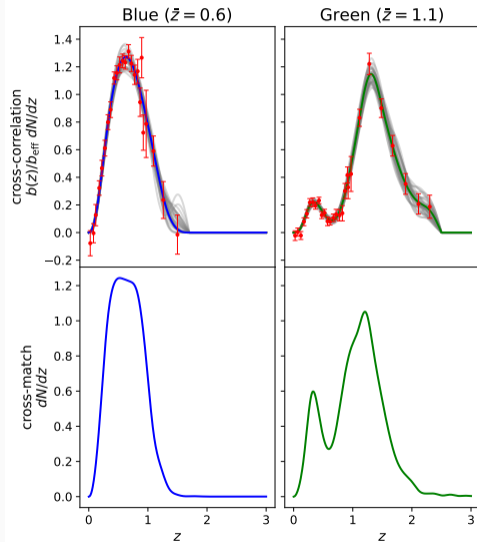
# Complementary probes of large scale structure



# The unWISE samples

- galaxies from the WISE survey
- including 2 years of post-cryogenic observations (at 3.4 and 4.6  $\mu\text{m}$ )
- >500 million galaxies
- $0 \lesssim z \lesssim 2$
- color selection for two samples

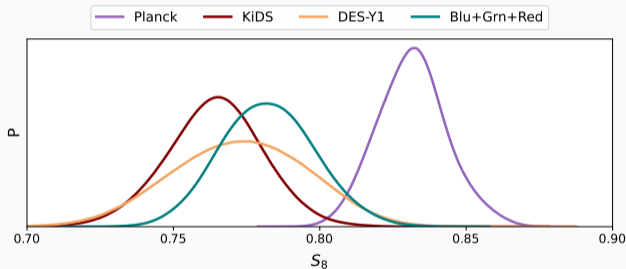
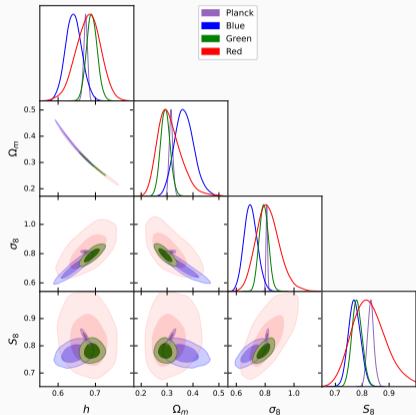
sample	$\bar{z}$	$\bar{n}$
Blue	0.6	$\sim 3400$
Green	1.1	$\sim 1800$



# Previous work on Planck lensing x unWISE

Spectra: Krolewski *et al.* (2020)

Cosmology analysis: Krolewski *et al.* (2021)



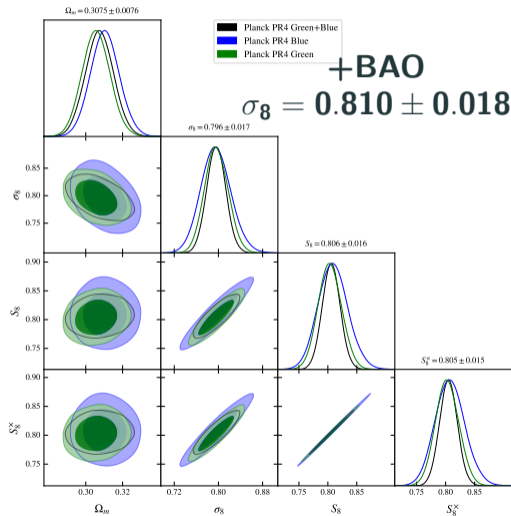
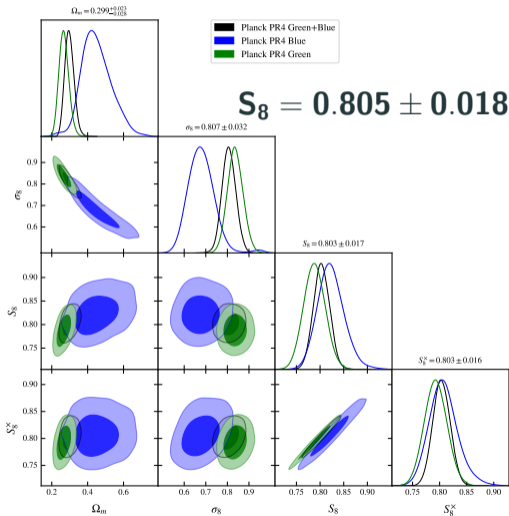
$$S_8 = 0.782 \pm 0.015$$

$\Rightarrow \sim 2.4\sigma$  tension with Planck 2pt

# What's new?

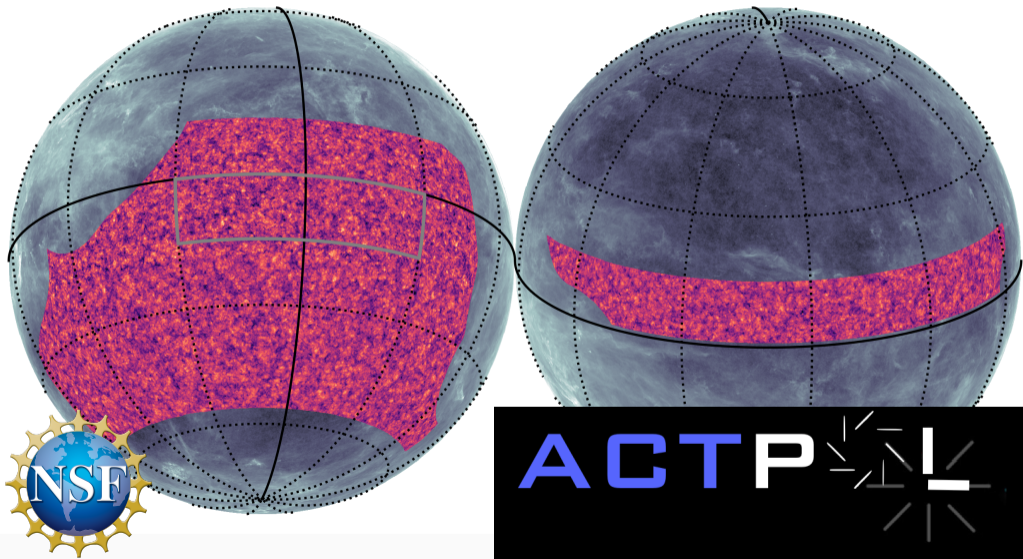
	Impact on $S_8$
Monte Carlo lensing norm correction	$+0.6\sigma$
modelling improvements	$-0.5\sigma$
Systematics weighting	$+0.4\sigma$
Additional spectroscopic data	$+0.8\sigma$
use of <i>Planck</i> PR4 lensing reconstruction	$+0.2\sigma$
PCA based $dN/dz$ marginalisation	$-0.2\sigma + \sim 15\%$ wider posteriors
fid. cosmo. correction	change in degeneracy directions
<b>Total</b>	<b><math>+1.3\sigma + \sim 15\%</math> wider posteriors</b>

# Re-analysis of unWISE x Planck lensing

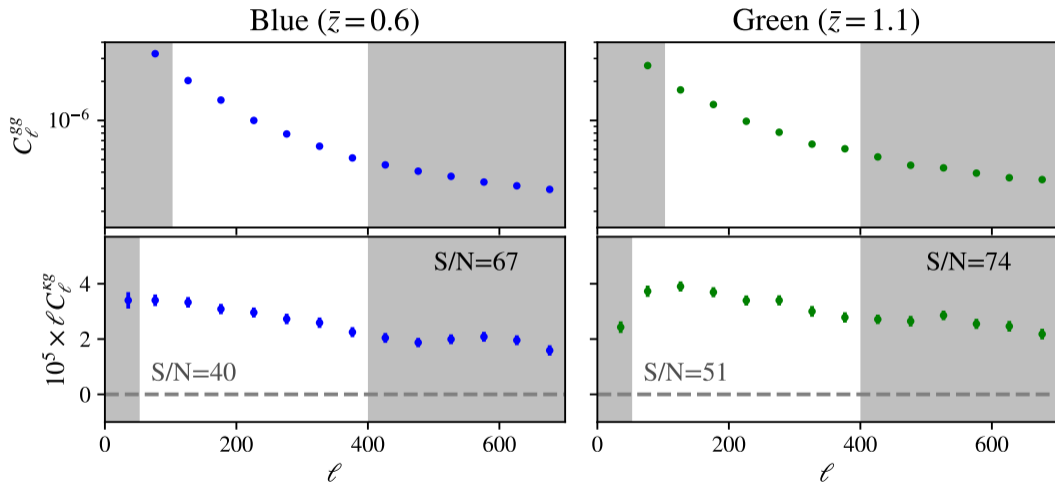




# ACT lensing reconstruction



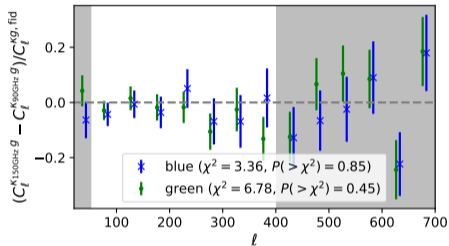
# cross-spectra unWISE x ACT DR6 lensing



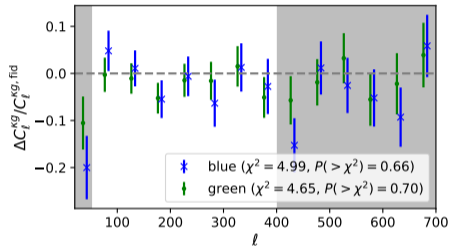
# Testing for systematic contamination

## Data Null-tests

frequency comparison



galactic mask comparison

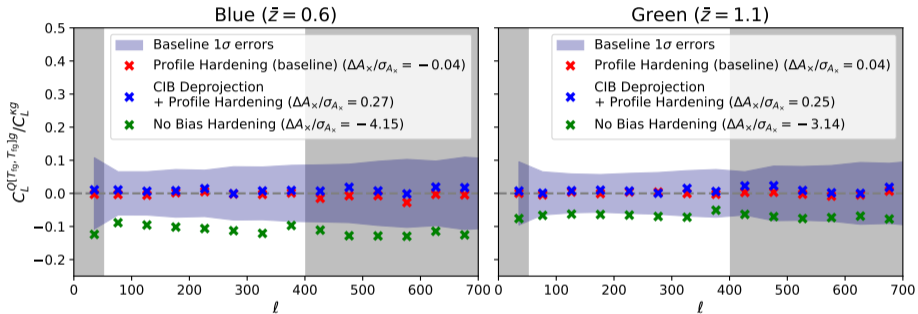


And many more ...

- different reconstruction and bias mitigation strategies (using CMB temperature/polarisation only, deprojecting CIB contamination, ...)
- various different masks (northern vs southern galactic cap, low vs higher ecliptic latitude, ...)

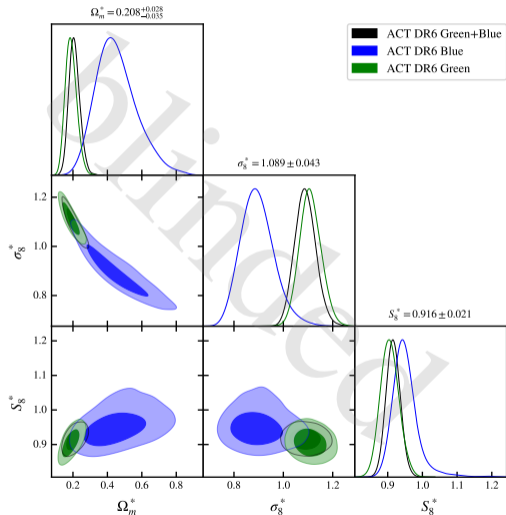
# Testing for systematic contamination (continued)

## Tests on simulations



- extragalactic foreground maps from WEBSKY simulations
- galaxy sample generated using unWISE HOD on WEBSKY halo catalog
- measure lensing signal induced by foregrounds

# Stay tuned for unWISE x ACT DR6 lensing cosmology



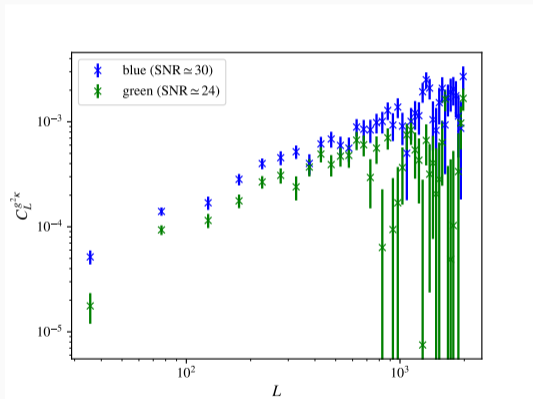
- comparable precision to Planck
- have recently unblinded
- results are forthcoming

# Looking further ahead

- will be combined with other probes (including  $C_l^{\kappa\kappa}$  and  $C_l^{TT} + C_l^{TE}$ , etc)
- probe extended models beyond vanilla  $\Lambda$ CDM (e.g.  $\sum m_\nu$ )
- will get further improved redshifts with DESI
- improved modelling using simulation derived emulators (e.g. Hybrid EFT; see DeRose *et al.*, 2023)
- (eventually) Simons Observatory Lensing  $\times$  e.g. LSST

**Thank you!**

# Aside: Detected $gg\kappa$ -bispectrum

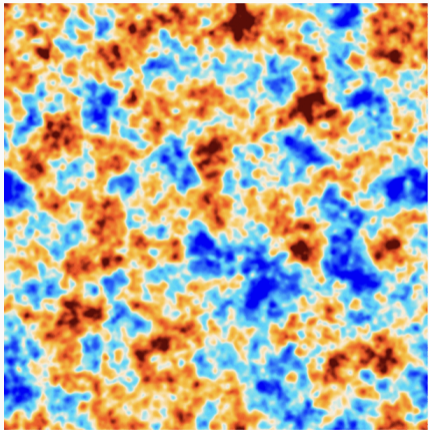


Very preliminary!

- use small scales and halo model to constrain HOD parameter
- use large scales and LPT model to constrain higher order biases



# The effect of CMB lensing

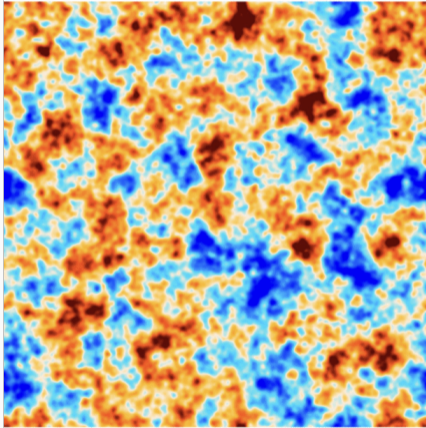


- observed field = unlensed field evaluated at a different position

$$\tilde{\Theta}(\mathbf{x}) = \Theta_0(\hat{\mathbf{n}} + \nabla\phi)$$

- small-scale ( $\mathcal{O}(\text{arc-minute})$ ) deflections described by a deflection potential  $\phi$
- coherent over larger,  $\mathcal{O}(\text{degree})$ , scales
- lensing convergence  $\kappa = -\frac{1}{2}\nabla^2\phi$
- $\phi \sim \int_0^{\chi_*} W_\phi(\chi)\delta_m(\hat{\mathbf{n}}\chi)d\chi$

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# CMB lensing reconstruction

- the unlensed CMB is statistically isotropic

$$\langle \Theta_0(\mathbf{l}) \Theta_0(\mathbf{l} - \mathbf{L}) \rangle = \delta(\mathbf{L}) C_L$$

- lensing breaks isotropy and couples different modes

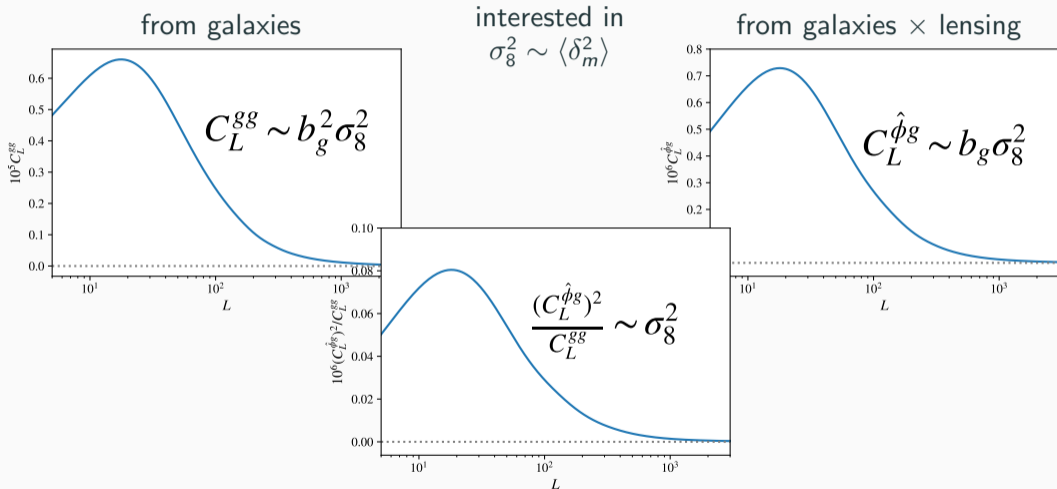
$$\langle \tilde{\Theta}(\mathbf{l}) \tilde{\Theta}(\mathbf{l} - \mathbf{L}) \rangle - \delta(\mathbf{L}) C_L \sim \phi(\mathbf{L})$$

- estimate lensing signal from off-diagonal correlations

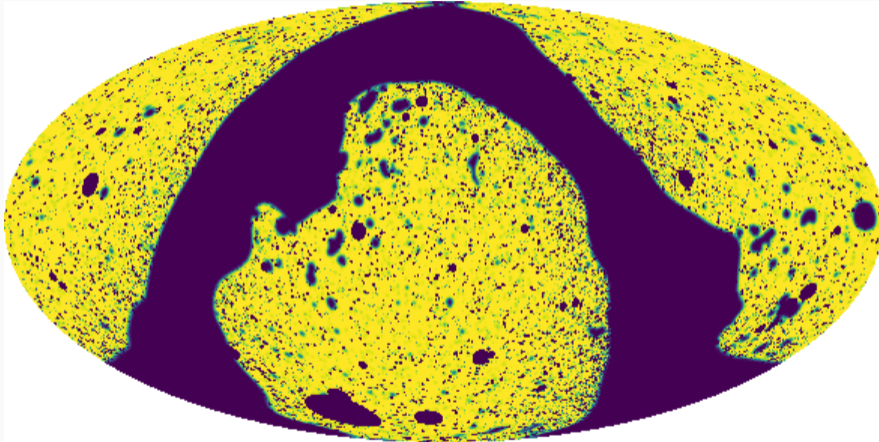
$$\hat{\phi}(\mathbf{L}) \sim \int d^2\mathbf{l} \tilde{\Theta}(\mathbf{l}) \tilde{\Theta}(\mathbf{l} - \mathbf{L})$$

- using quadratic estimators

# Measuring $\sigma_8$ with galaxy - CMB lensing cross-correlations



# Sky-coverage - unWISE



$$f_{\text{sky}} \simeq 0.59$$

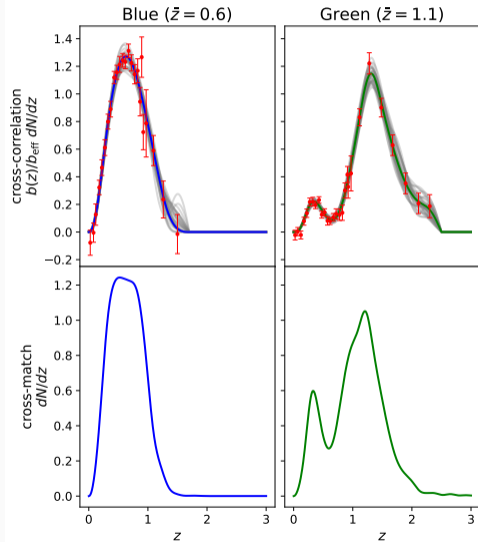
# Redshifts for unWISE

$dN/dz$  from ...

- cross-correlating with spectroscopic surveys (BOSS, eBOSS)

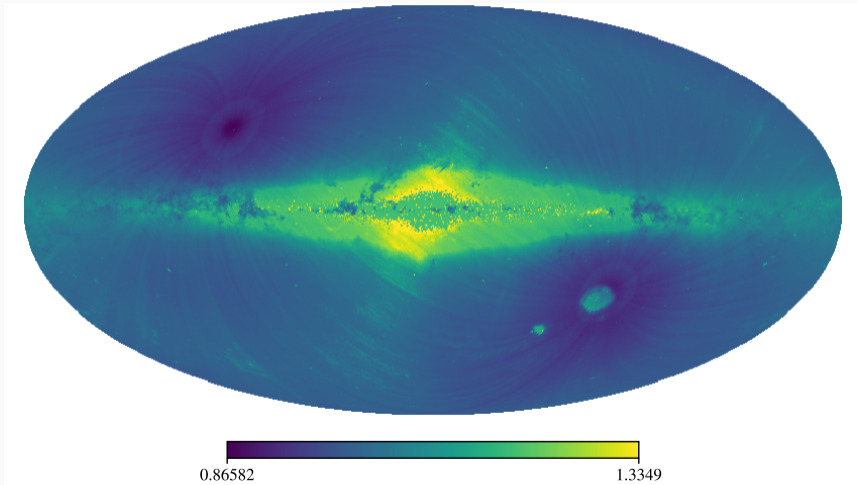
$$b_{\text{photo.}} \frac{\widehat{dN}_{\text{photo.}}}{dz} \propto \frac{w^{\text{spec.} \times \text{photo.}}(z)}{\sqrt{w^{\text{spec.} \times \text{spec.}}(z)}}$$

- cross matching with photometric redshifts on smaller field (COSMOS)

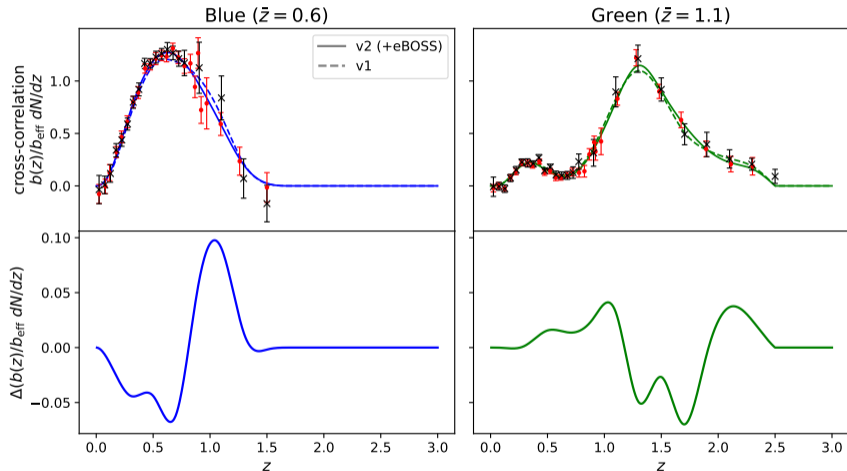


# Systematics weighting

piecewise linear trends for **survey depth** and **stellar density**

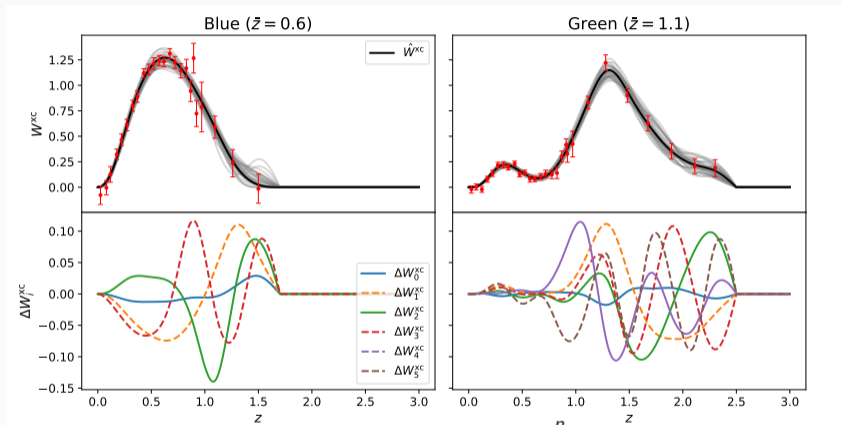


# Additional spectroscopic data from eBOSS



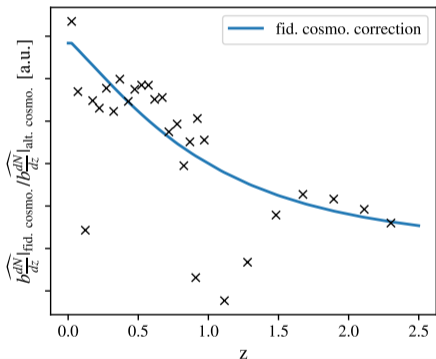


# PCA based $dN/dz$ marginalisation



$$W^{\text{xc}}(z) = \hat{W}^{\text{xc}}(z) + \Delta W_0^{\text{xc}}(z) + \sum_{i=1}^n c_i \Delta W_i^{\text{xc}}(z)$$

# Correcting fid. cosmo. dependence of cross-correlation redshifts



- assume fid. cosmo. to measure cross-correlation redshifts
- marginalise over amplitude of  $\widehat{b \frac{dN}{dz}}$
- need to correct  $z$ -dependent fid. cosmo. dependence

$$\widehat{b \frac{dN}{dz}} = \widehat{b \frac{dN}{dz}} \Big|_{\text{fid. cosmo.}} \frac{\mathcal{C}(z)}{\mathcal{C}(z)|_{\text{fid. cosmo.}}}$$

$$\mathcal{C}(z) = \left[ \Delta z H(z) \int k dk P_{gg}(k, z) W(k, z) \right]^{-1/2}$$

# Model

- Limber approximation for  $C_\ell^{gg}$  and  $C_\ell^{\kappa g}$
- including lensing magnification
- Power spectrum model: Hybrid Halofit + LPT (like Krolewski *et al.*, 2021)

$$P_{gg}(k, z) = b_{1,E}^2(z)P_{mm,HF} + b_{2,L}(z)P_{b_2}(k, z) + b_{s,L}(z)P_{b_s}(k, z) \\ + b_{1,L}(z)b_{2,L}(z)P_{b_1b_2}(k, z) + \dots + P_{\text{shot noise}}$$

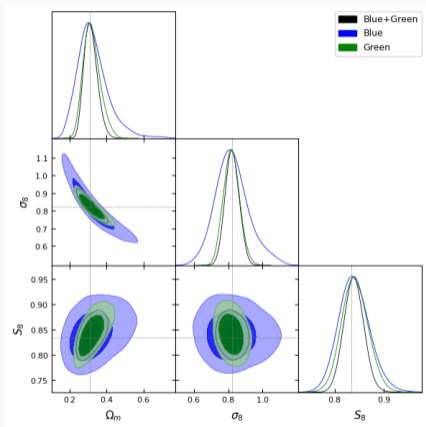
$$P_{gm}(k, z) = b_{1,E}(z)P_{mm,HF} + \frac{b_{2,L}(z)}{2}P_{b_2}(k, z) + \frac{b_{s,L}(z)}{2}P_{b_s}(k, z)$$

$$P_{mm}(k, z) = P_{mm,HF}(k, z).$$

- higher order biases set by co-evolution relations + free offset (co-evolution and priors from simulations)

$$b_{X,L} = b_{X,L}^{\text{co-evol.}}(b_{1,E}^{\text{fid}}(z)) + c_{b_{X,L}}^{\text{offset}}$$

# Model verification



- $N$ -body sims populated with HOD tuned to reproduce unWISE samples (from Krolewski *et al.*, 2021)

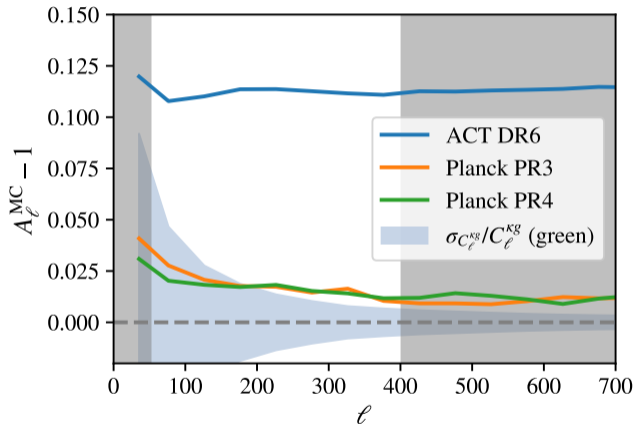
	$\Delta\Omega_m/\sigma_{\Omega_m}$	$\Delta\sigma_8/\sigma_{\sigma_8}$	$\Delta S_8/\sigma_{S_8}$
Blue	0.18	-0.07	0.28
Green	0.18	-0.14	0.07
Joint	0.19	-0.16	0.08

# Model (massive neutrinos)

account for non-clustering neutrinos by using (following Chen *et al.*, 2022)

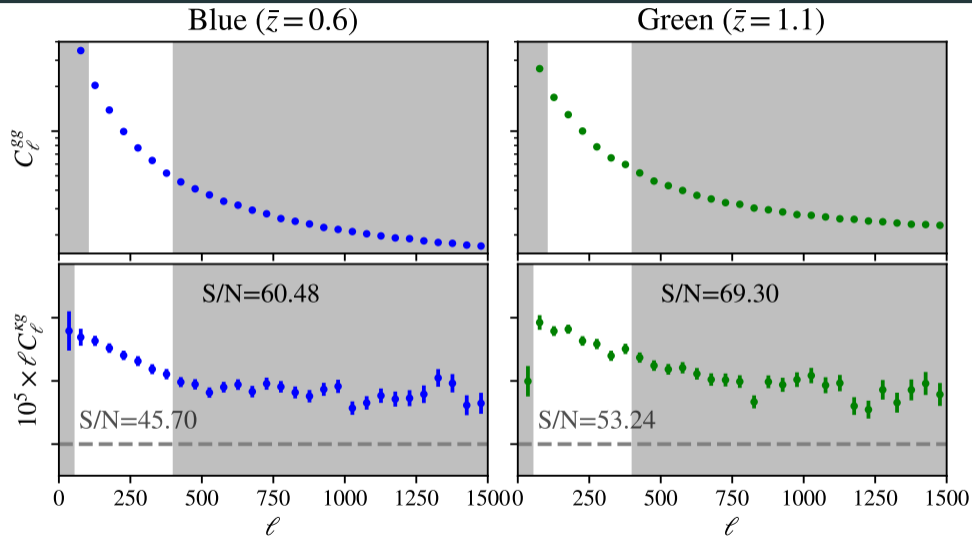
- $P_{gg}$ :  $\nu$ -free power spectrum,  $\langle \delta_{cb} \delta_{cb} \rangle$
- $P_{mm}$ : power spectrum including neutrinos,  $\langle \delta_m \delta_m \rangle$
- $P_{mg}$ : cross power spectrum between total matter (including neutrinos) and non-relativistic matter (baryons and dark matter only),  $\langle \delta_m \delta_{cb} \rangle$

# Monte-carlo lensing norm correction



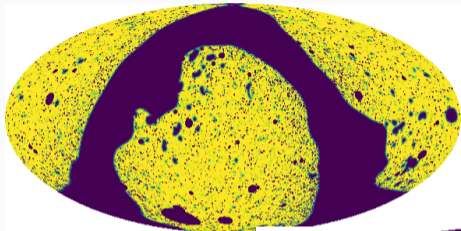
$$A_\ell^{\text{MC}} = \frac{\langle \kappa_{\text{input}} \times \kappa_{\text{input}} \rangle}{\langle \hat{\kappa}_{\text{recon.}} \times \kappa_{\text{input}} \rangle}$$

# Improved Planck PR4 (NPIPE) lensing reconstruction



# Sky-coverage - unWISE x ACT

unWISE

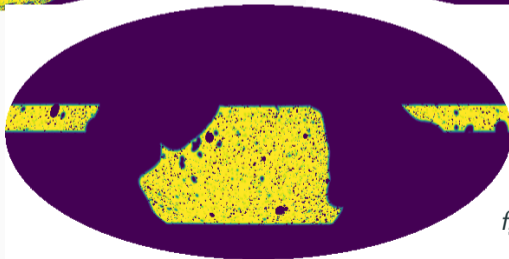


$f_{\text{sky}} \simeq 0.59$

ACT lensing



$f_{\text{sky}} \simeq 0.23$



$f_{\text{sky}} \simeq 0.20$



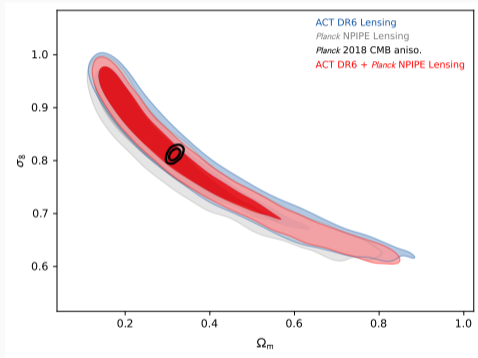
# Blinding

## We perform our analysis fully blinded!

Before unblinding our cosmological constraints we...

- perform  $\mathcal{O}(100)$  bandpower and map level null-tests for  $C_\ell^{\kappa g}$  and  $C_\ell^{gg}$
- estimate (extragalactic) foreground biases from realistic simulations
- perform a series of blind parameter consistency test examining different data cuts and analysis choices
- freeze all baseline priors and scale cuts

# ACT DR6 lensing auto-spectrum results



Best constrained parameter  
 $S_8^{\text{CMBL}} = \sigma_8 \left( \frac{\Omega_m}{0.3} \right)^{0.25}$

**ACT DR6 Lensing**

$$S_8^{\text{CMBL}} = 0.818 \pm 0.022$$

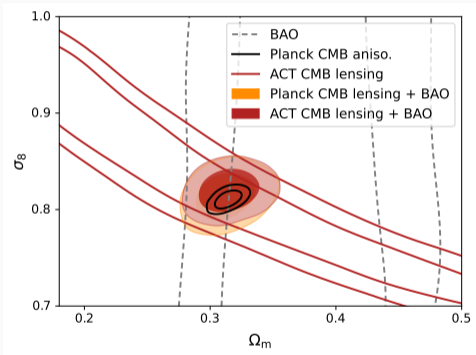
**ACT DR6 + Planck PR4 Lensing**

$$S_8^{\text{CMBL}} = 0.813 \pm 0.018$$

**Planck 2018 CMB aniso.**

$$S_8^{\text{CMBL}} = 0.823 \pm 0.011$$

# ACT DR6 lensing auto-spectrum results



**ACT DR6 Lensing + BAO**

$$\sigma_8 = 0.819 \pm 0.015$$

**ACT DR6 + Planck PR4 Lensing**

$$\sigma_8 = 0.812 \pm 0.013$$

**Planck 2018 CMB aniso.**

$$\sigma_8 = 0.811 \pm 0.006$$

- A. Krolewski, S. Ferraro, and M. White, *Journal of Cosmology and Astroparticle Physics* **2021** (12), arXiv:2105.03421 .
- E. Abdalla *et al.*, *Journal of High Energy Astrophysics* **34**, 49 (2022).
- Planck Collaboration, Aghanim, N., Akrami, Y., Ashdown, M., Aumont, J., *et al.*, *A&A* **641**, A8 (2020).
- A. Krolewski, S. Ferraro, E. F. Schlafly, and M. White, *Journal of Cosmology and Astroparticle Physics* **2020** (5), arXiv:1909.07412 .
- J. DeRose, N. Kokron, A. Banerjee, S.-F. Chen, M. White, *et al.*, (2023), arXiv:2303.09762 [astro-ph.CO] .
- S.-F. Chen, M. White, J. DeRose, and N. Kokron, *Journal of Cosmology and Astroparticle Physics* **2022** (07), 041.