

# CMB lensing tomography to $z=2$ with galaxies from the unWISE catalog

---

*Alex Krolewski*

*UC Berkeley ➡ Waterloo/Perimeter*

*with Simone Ferraro, Eddie Schlafly, Martin White*

*arxiv: 1909.07412*

*IPMU, 2020 Sep 30*

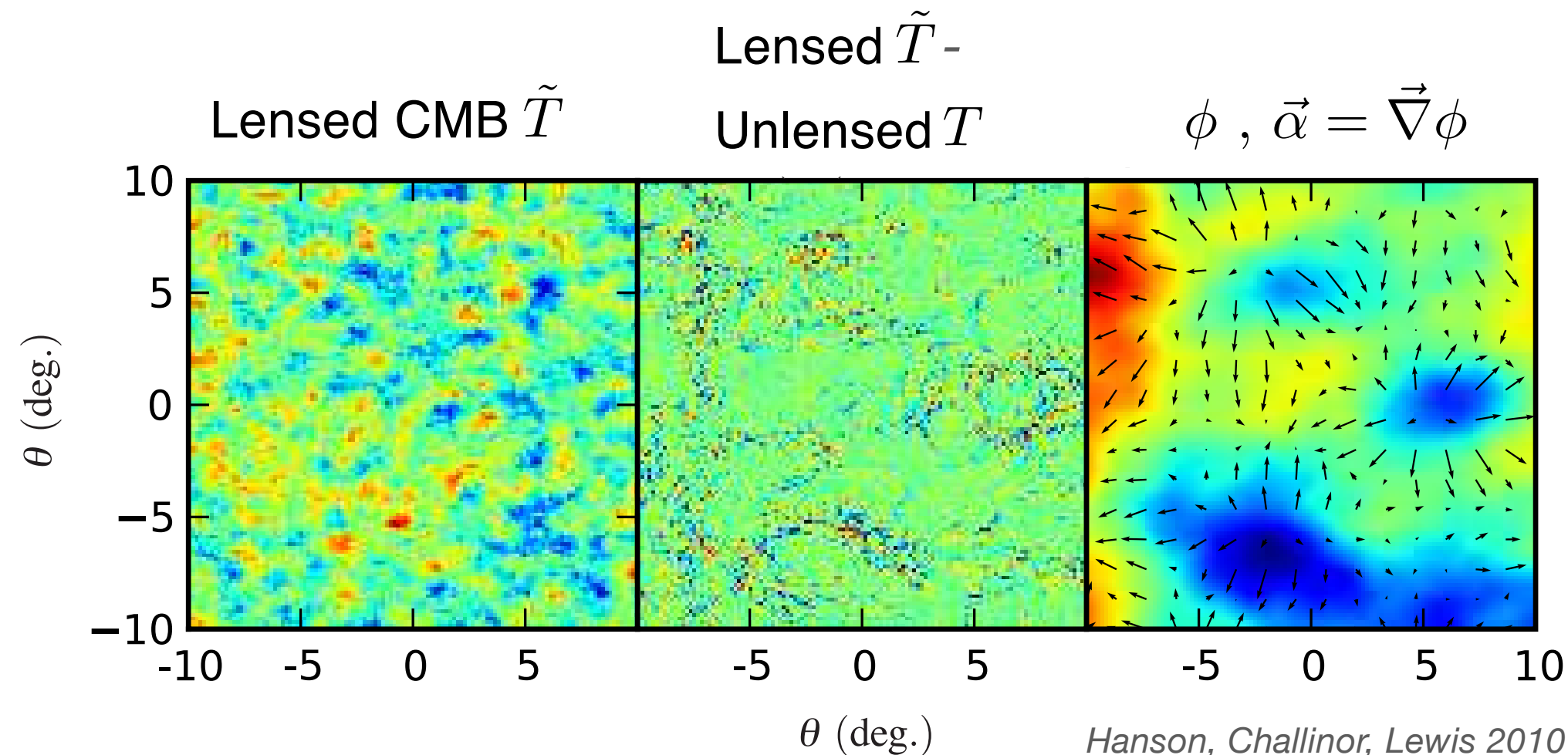


# OVERVIEW

---

- Intro: cosmology from CMB lensing cross-correlations
- unWISE as ideal sample for a high-S/N measurement
  - highest CMB lensing cross-correlation S/N to date (S/N $\sim$ 80)
- Examples of systematics:
  - Measuring the unWISE redshift distribution
  - Leakage from low  $\ell$  & mask deconvolution
- Nonlinearities & towards cosmological parameter constraints (preliminary): what is our take on the S8 tension?

# CMB LENSING

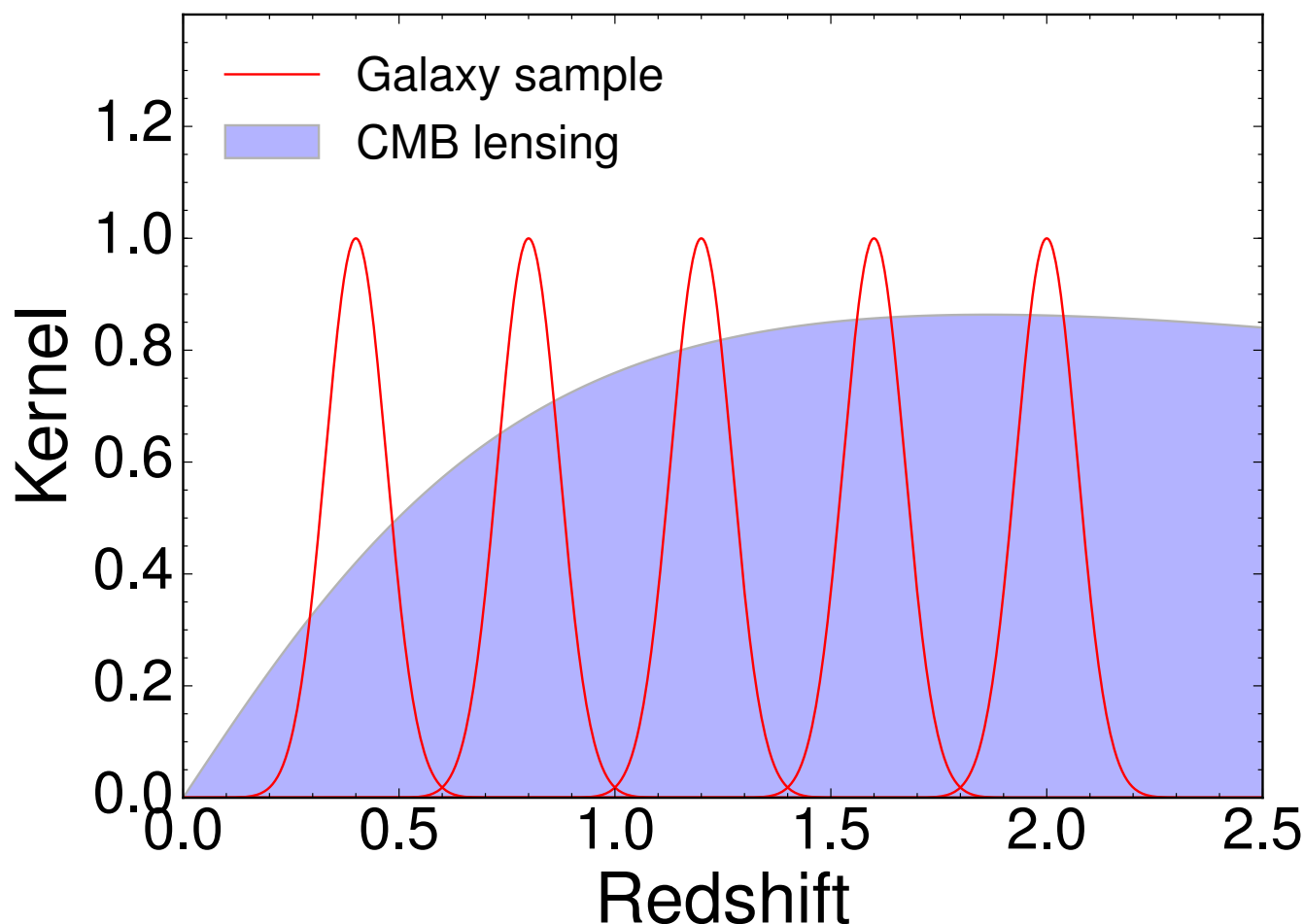


*Hanson, Challinor, Lewis 2010*  
*Hu & Okamoto 2002*

- Alternative to galaxy lensing (no source  $z$  uncertainty, no shape measurement)

# CMB LENSING TOMOGRAPHY

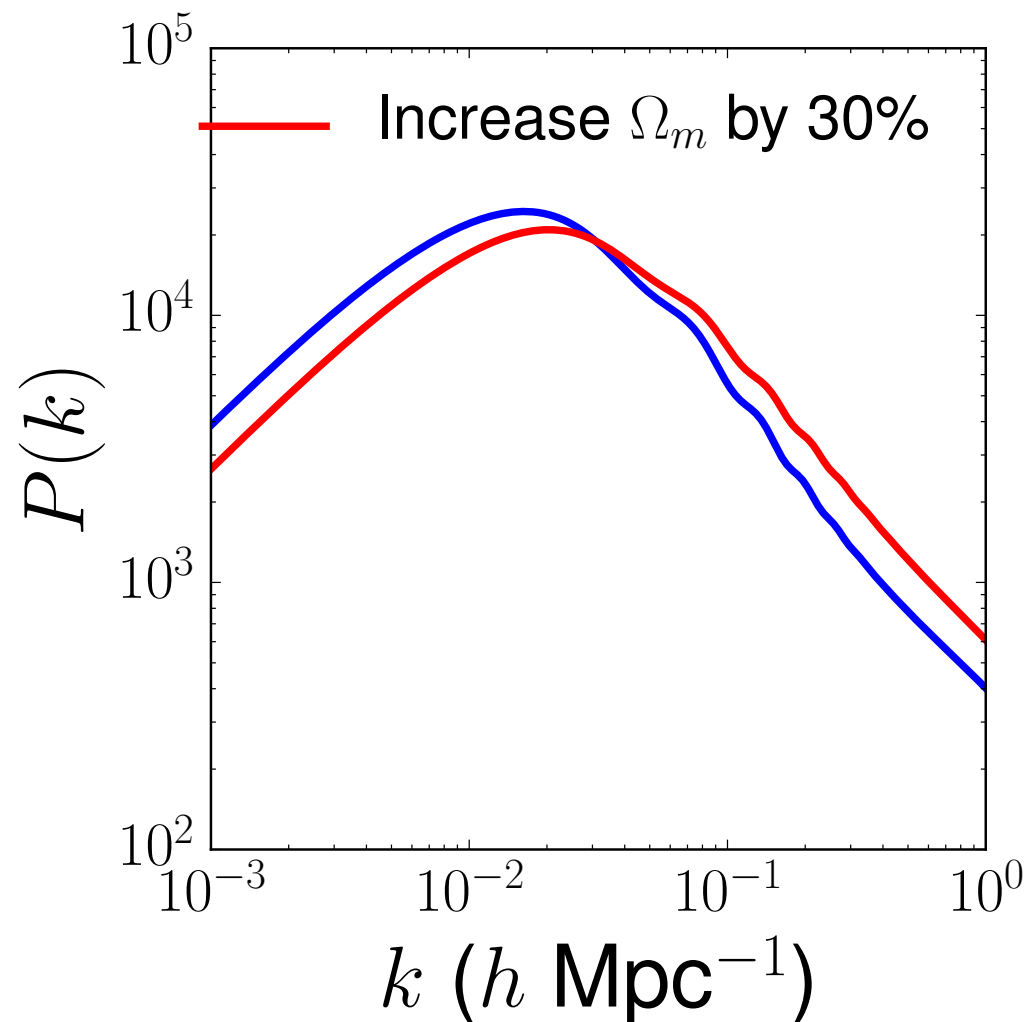
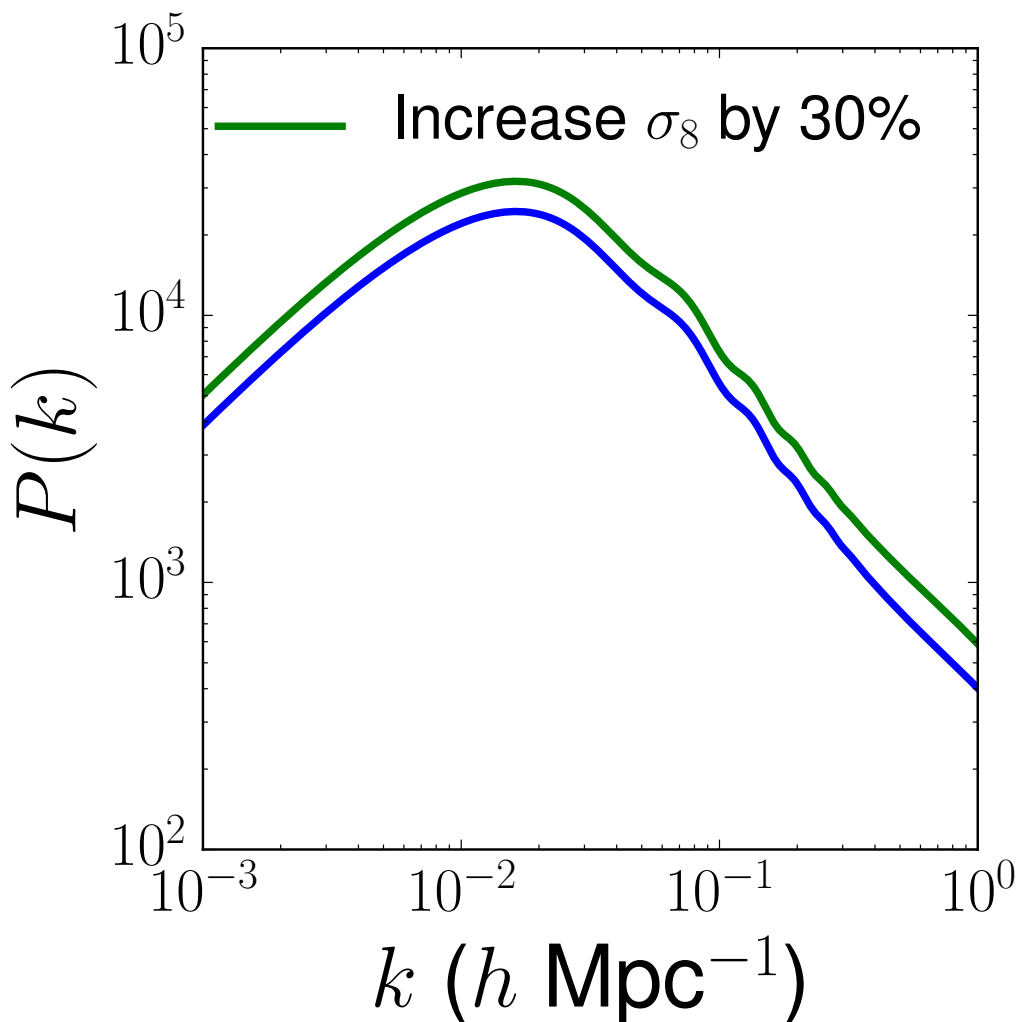
- CMB lensing cross-correlation + galaxy autocorrelation breaks  $b$ - $\sigma_8$  degeneracy
- $$P_{gg} \propto b(k, z)^2 \sigma_8^2 P_m$$
- $$P_{\kappa g} \propto b(k, z) \sigma_8^2 P_m$$



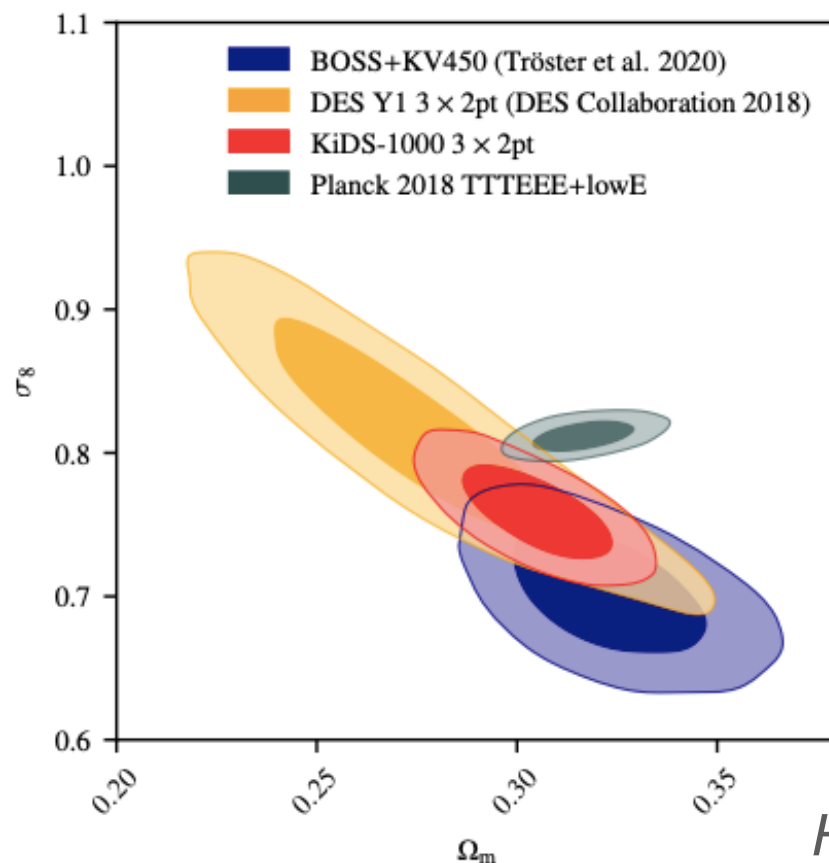


# CONSTRAINING $\Lambda$ CDM FROM CMB LENSING TOMOGRAPHY

- Lensing tomography probes power spectrum at different redshifts: primarily sensitive to  $\sigma_8$  and  $\Omega_m$   $S_8 = \sigma_8 \sqrt{\Omega_m/0.3}$



# S8 TENSION IN WEAK LENSING



$$P_{\kappa g} \propto b(z) S_8^2$$

$$P_{gg} \propto b(z)^2 S_8^2$$

$$S_8 \propto \frac{P_{\kappa g}}{\sqrt{P_{gg}}}$$

*Heymans et al. 2020*

- Can we use CMB lensing-LSS cross-correlations to address the  $S_8$  tension from KiDS and other weak lensing probes?
- KiDS:  $S_8 = 0.766$  vs  $0.834$  from Planck: requires  $70\sigma$  detection to validate or disprove tension at  $5\sigma$

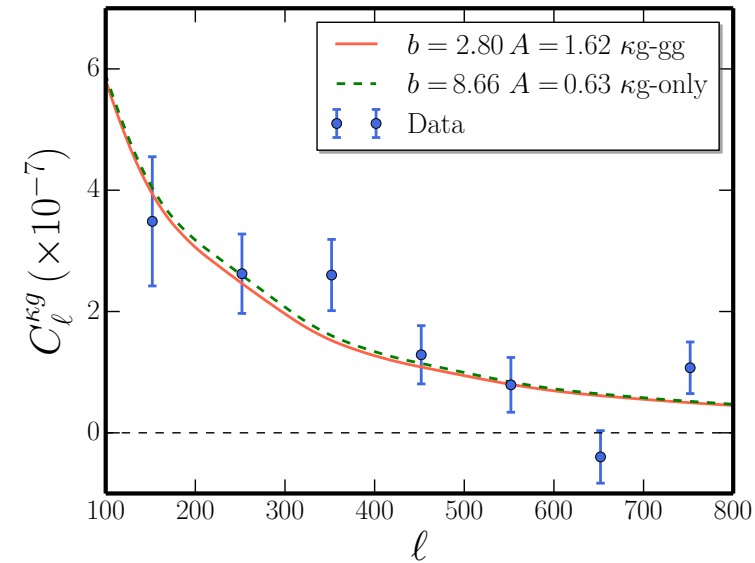
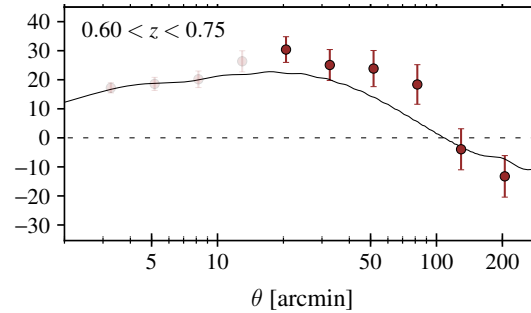
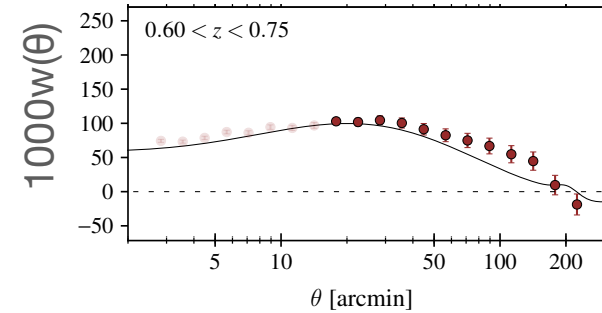
# PREVIOUS CMB-LSS CROSS CORRELATIONS

*Herschel x Planck, 10 $\sigma$*

*DES x SPT-Planck, 20 $\sigma$*

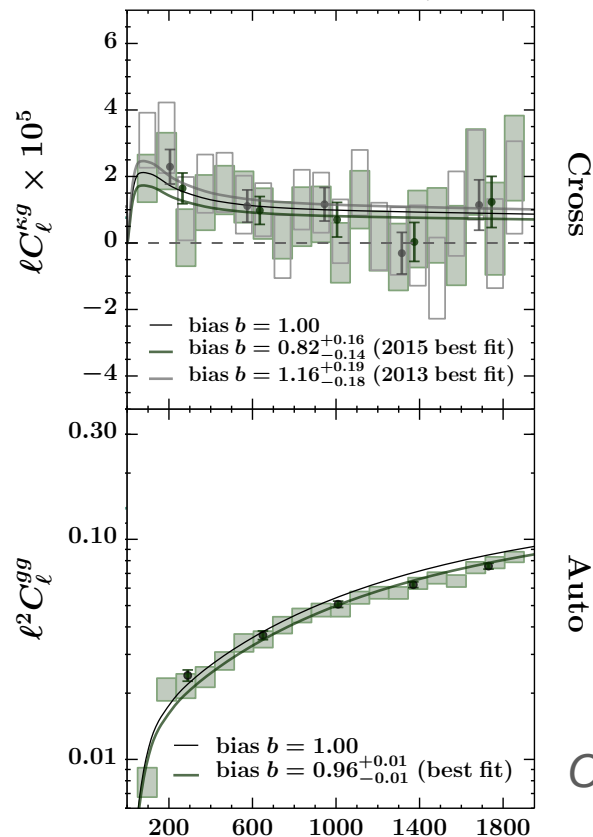
*galaxy-galaxy*

*galaxy-CMB lens*



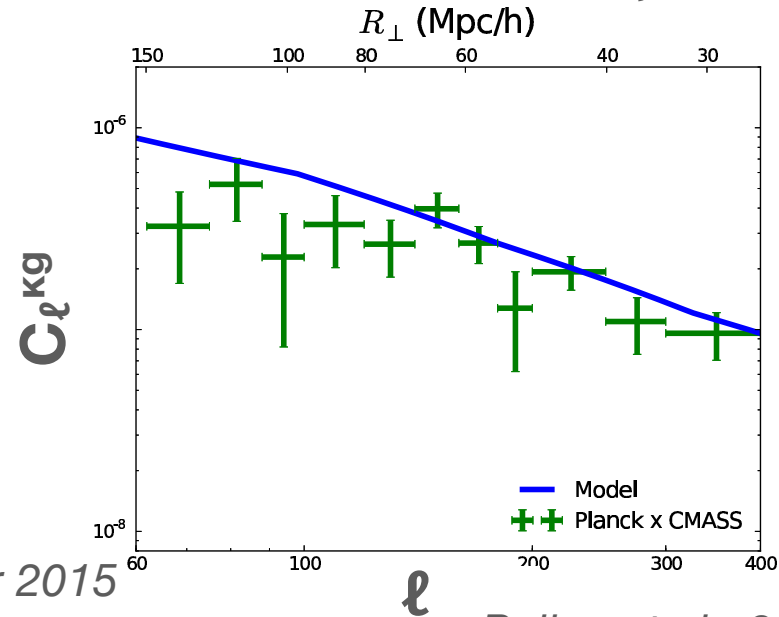
*CFHT x Planck, ~6 $\sigma$*

*Omori et al. 2019*



*CMASS x Planck, ~8 $\sigma$*

*Bianchini et al., 2015*



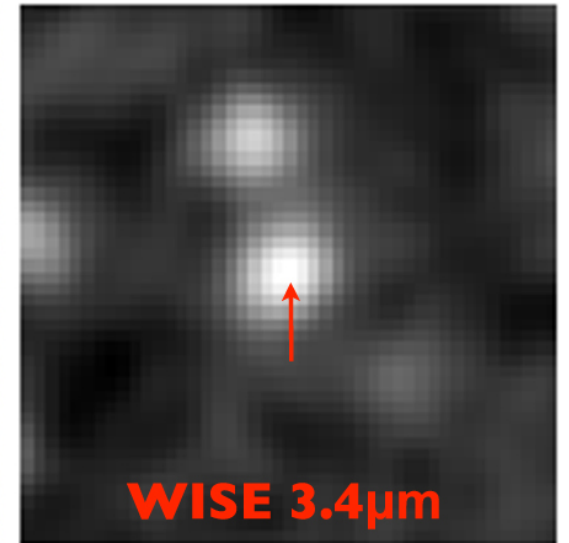
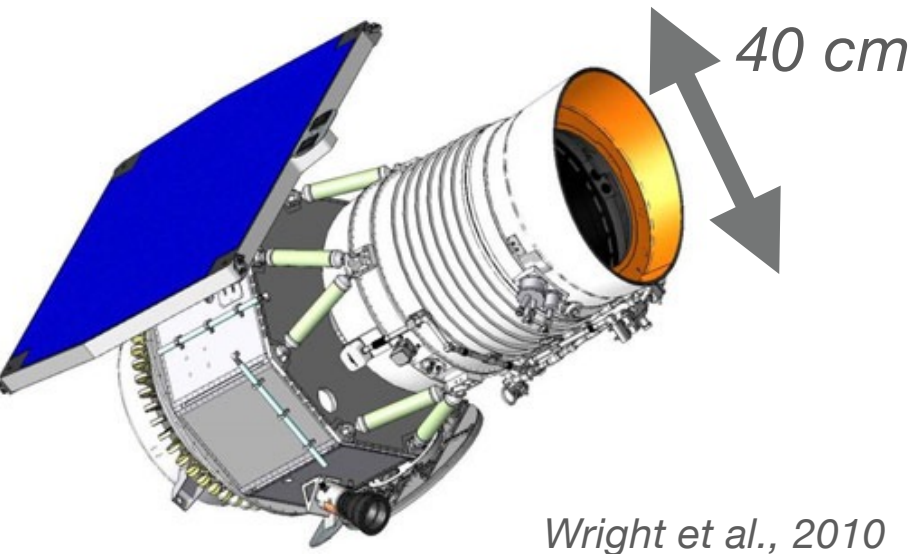
*Omori & Holder 2015*

*Pullen et al., 2016*

# BUILDING THE BEST CMB-LSS CORRELATION

---

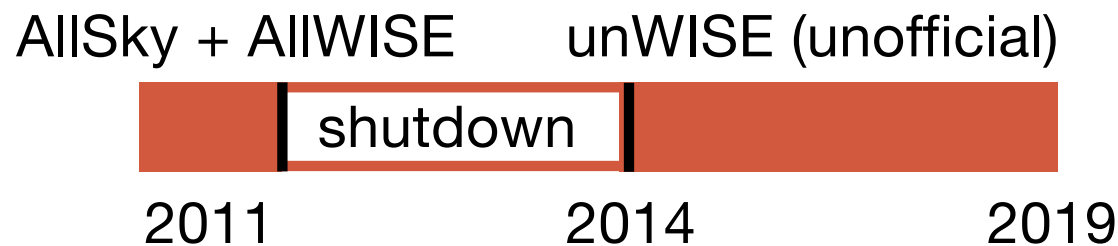
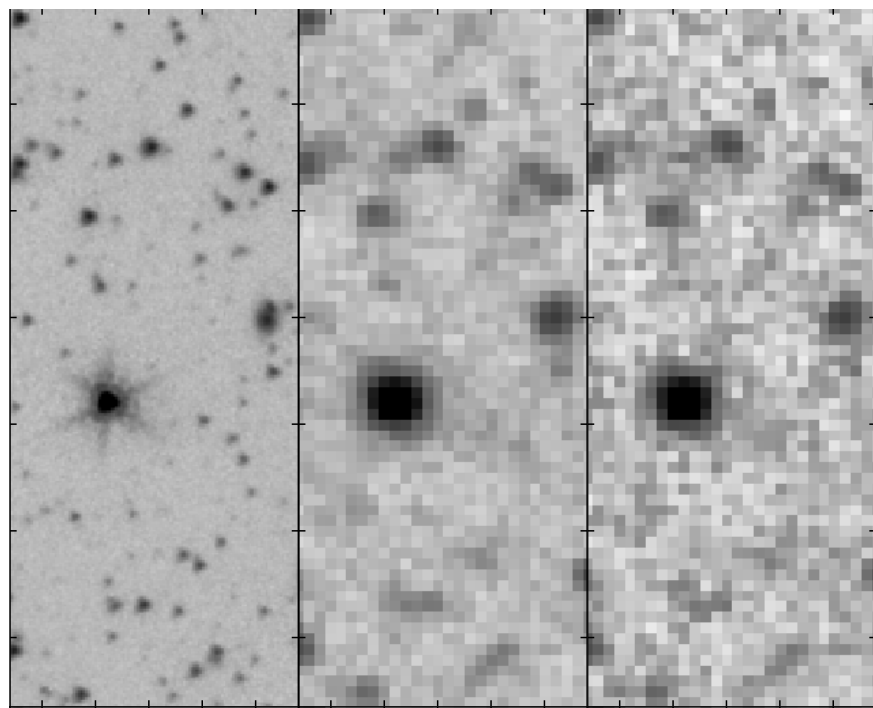
- Advantages of WISE:
  - All-sky satellite mission
  - Infrared survey (3.4, 4.6  $\mu\text{m}$ ): negative K-correction for old stellar populations—measure galaxies out to  $z \sim 2$



# unWISE CATALOG

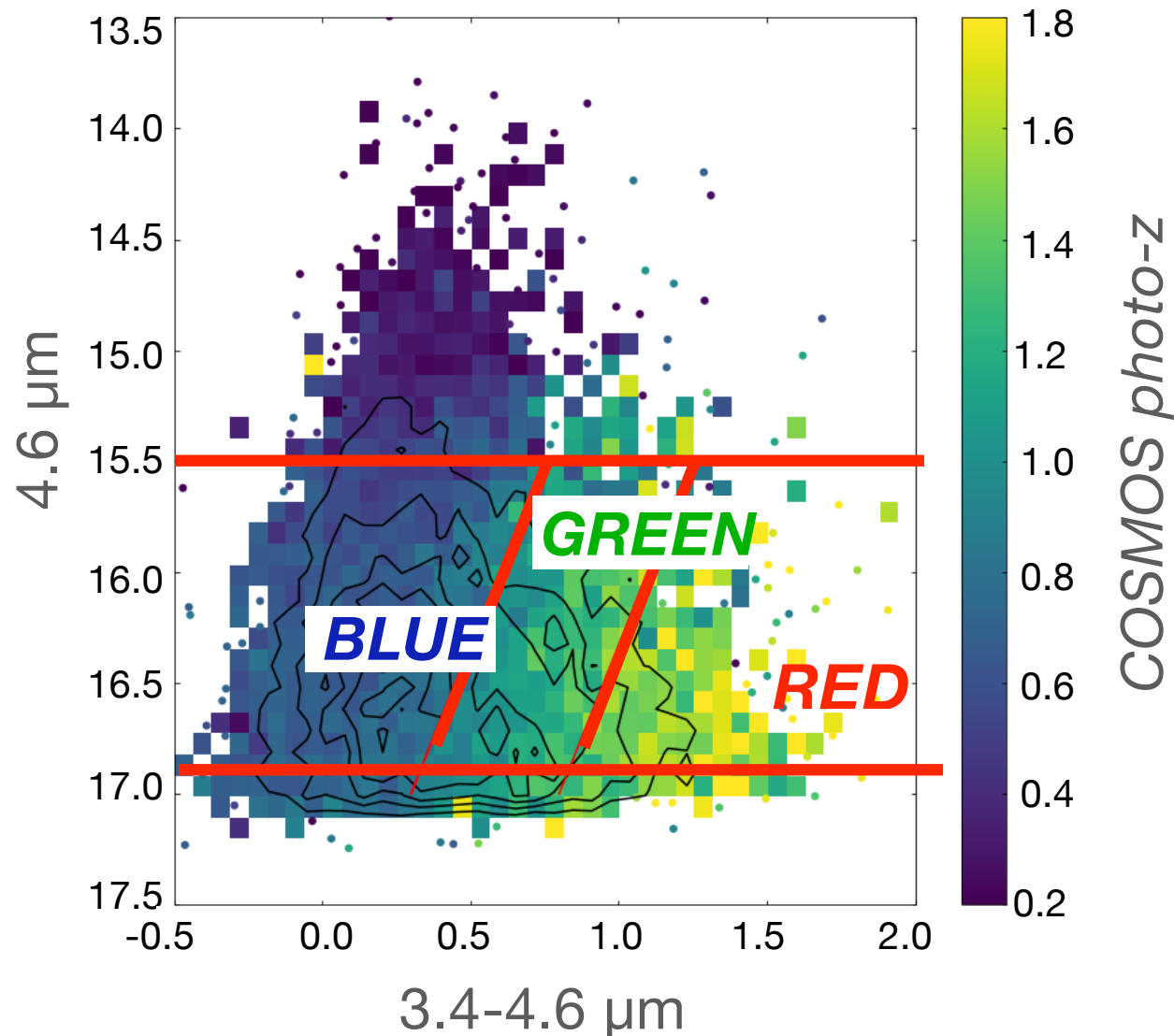
- Original 13 month mission (2010) + NeoWISE re-activation 2014-present (3.4, 4.6  $\mu\text{m}$  only)
  - No official WISE catalog after 2012 (despite 5x more data)
- unWISE: unofficial catalog, outgrowth of forced photometry for DESI targeting

*Spitzer*      *unWISE*      *WISE*



*Schlafly et al. 2019*  
[catalog.unwise.me](http://catalog.unwise.me)

# unWISE GALAXY SAMPLES

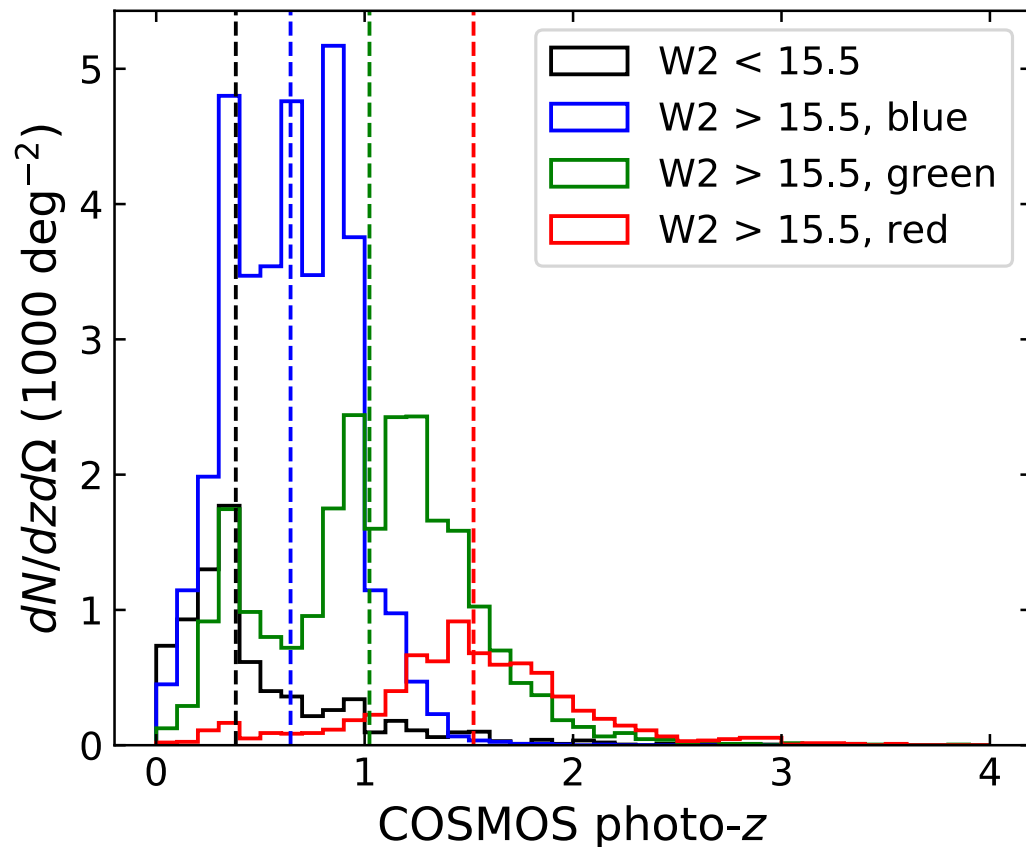


*Schlafly et al. 2019*

- Remove stars using GAIA: 1% stellar contamination

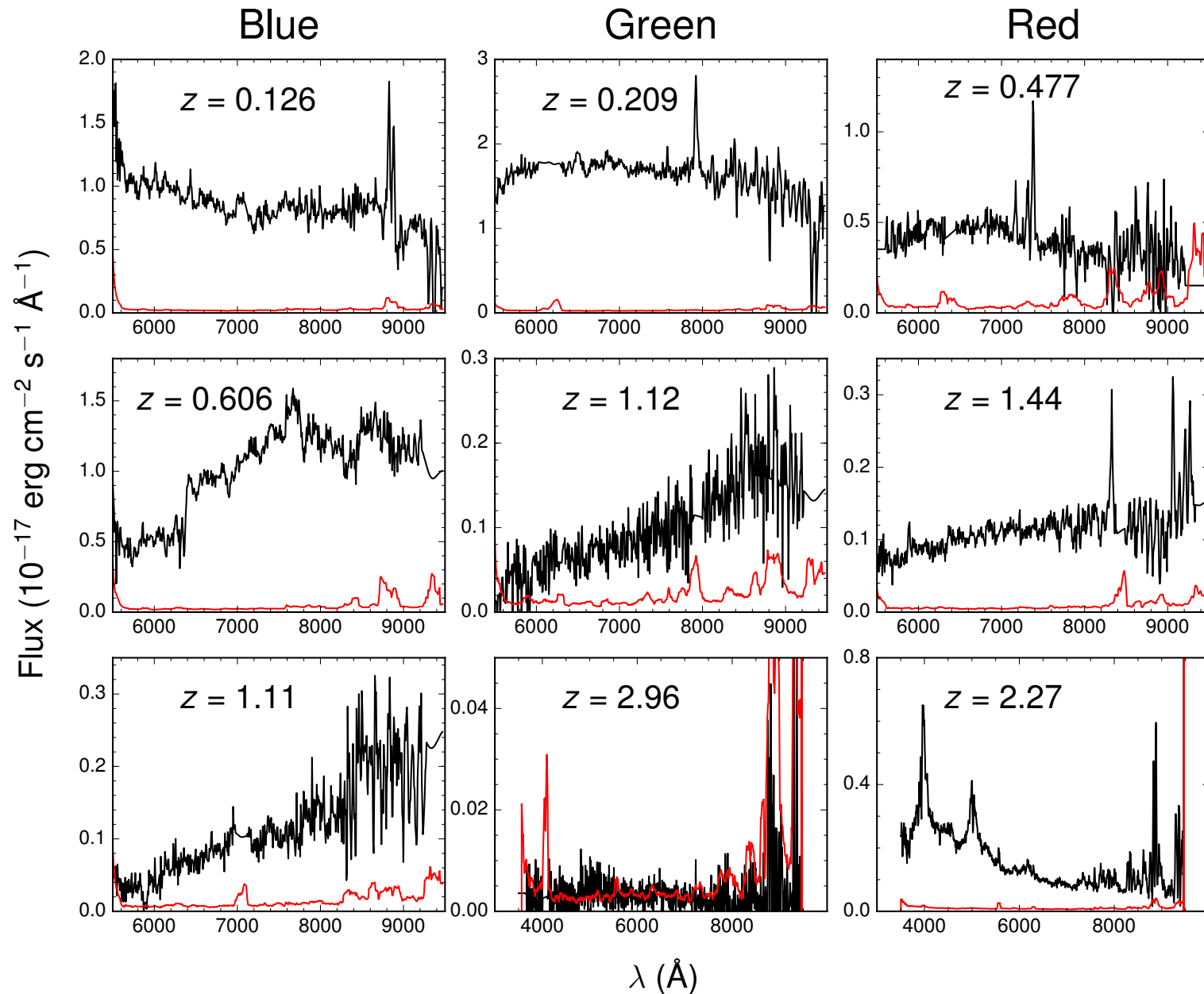
# unWISE GALAXY SAMPLES

Sample	Mean redshift	Number density (deg <sup>-2</sup> )
Blue	0.6	3409
Green	1.1	1868
Red	1.5	144



*Schlafly et al. 2019*

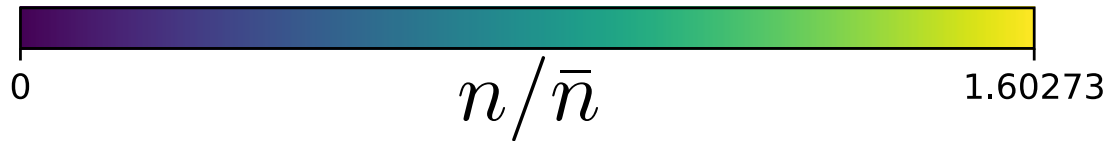
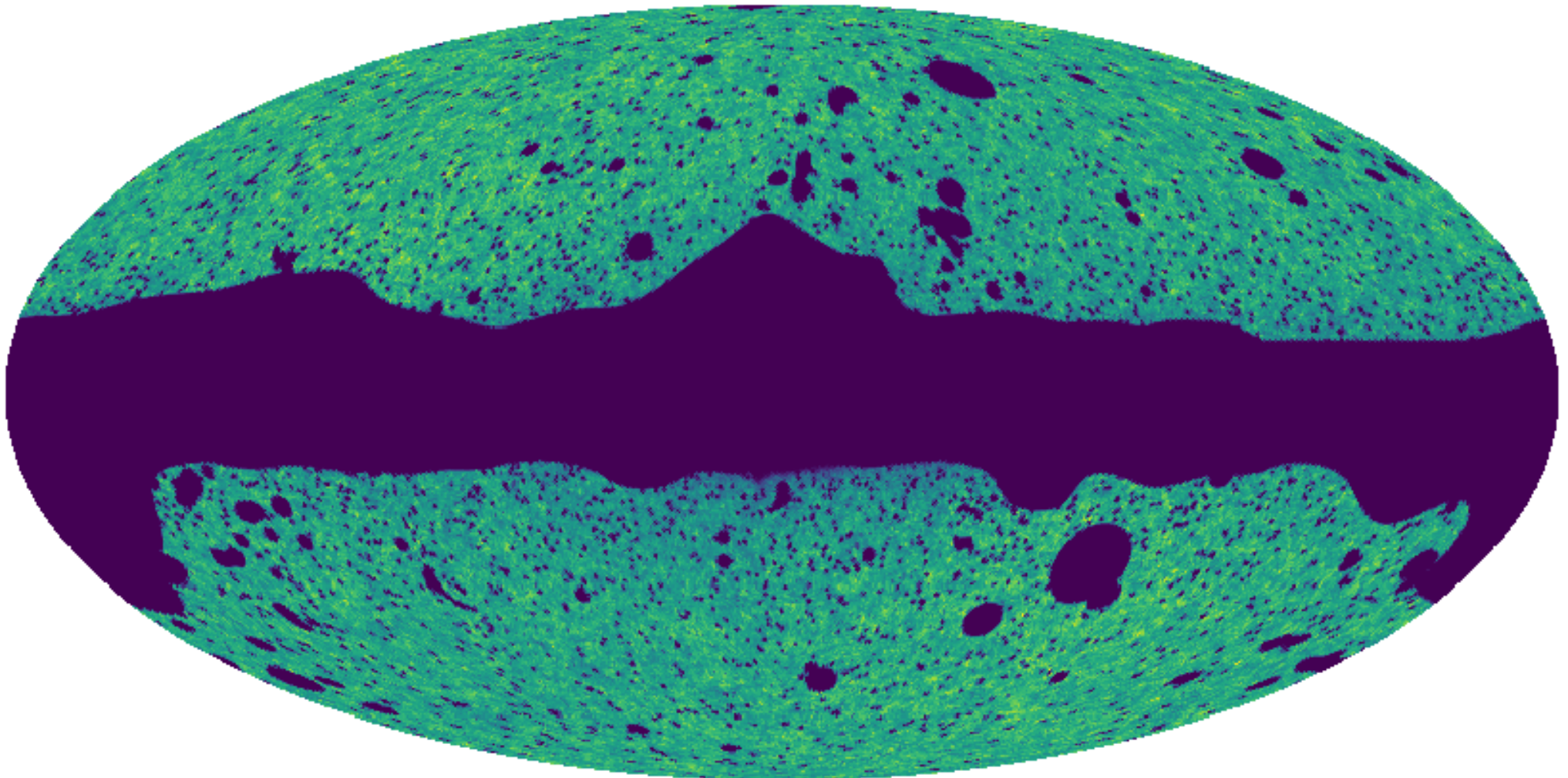
# OPTICAL SPECTRA OF unWISE GALAXIES





# SKY DISTRIBUTION

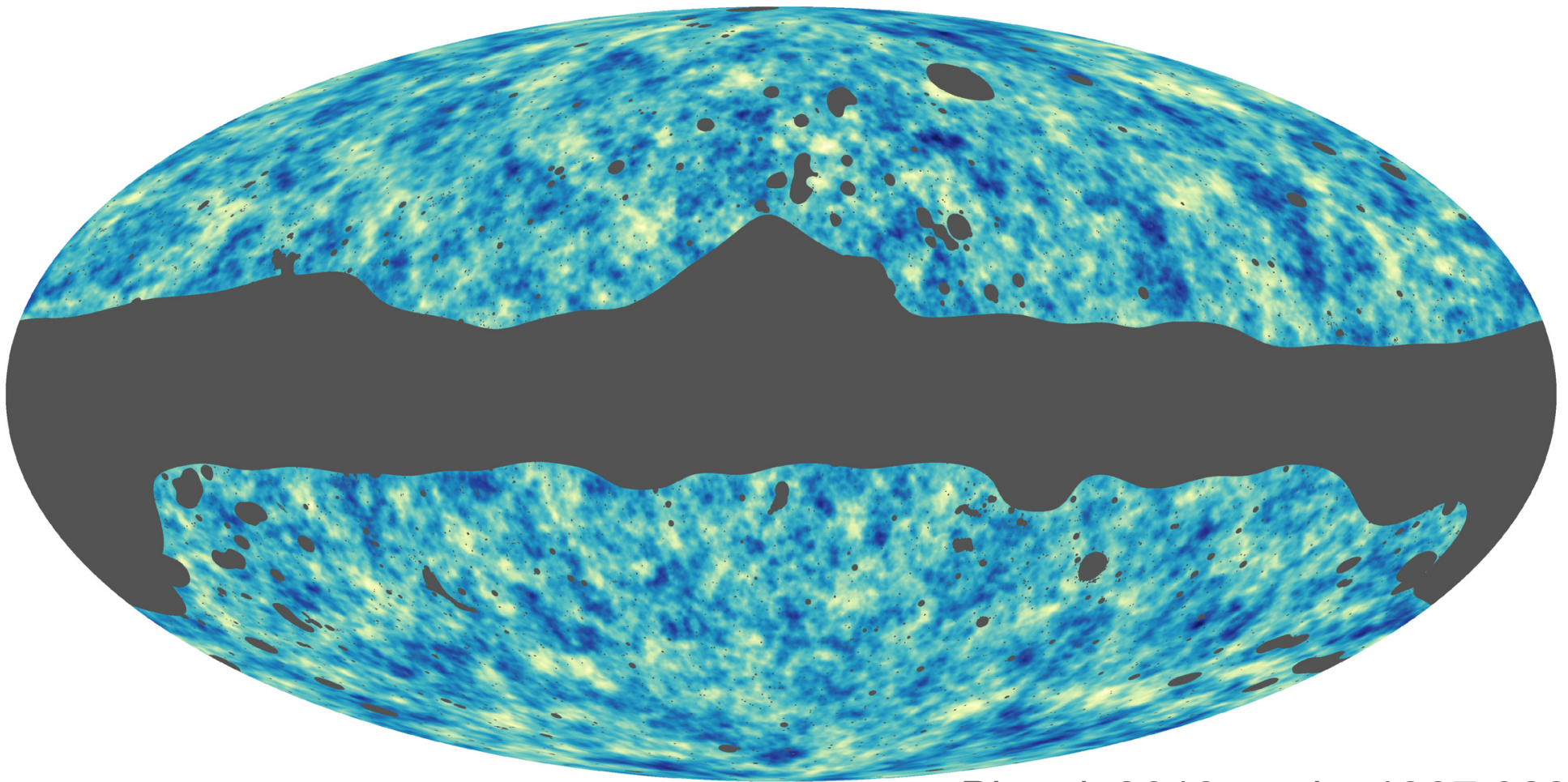
Blue sample



# PLANCK CMB LENSING

---

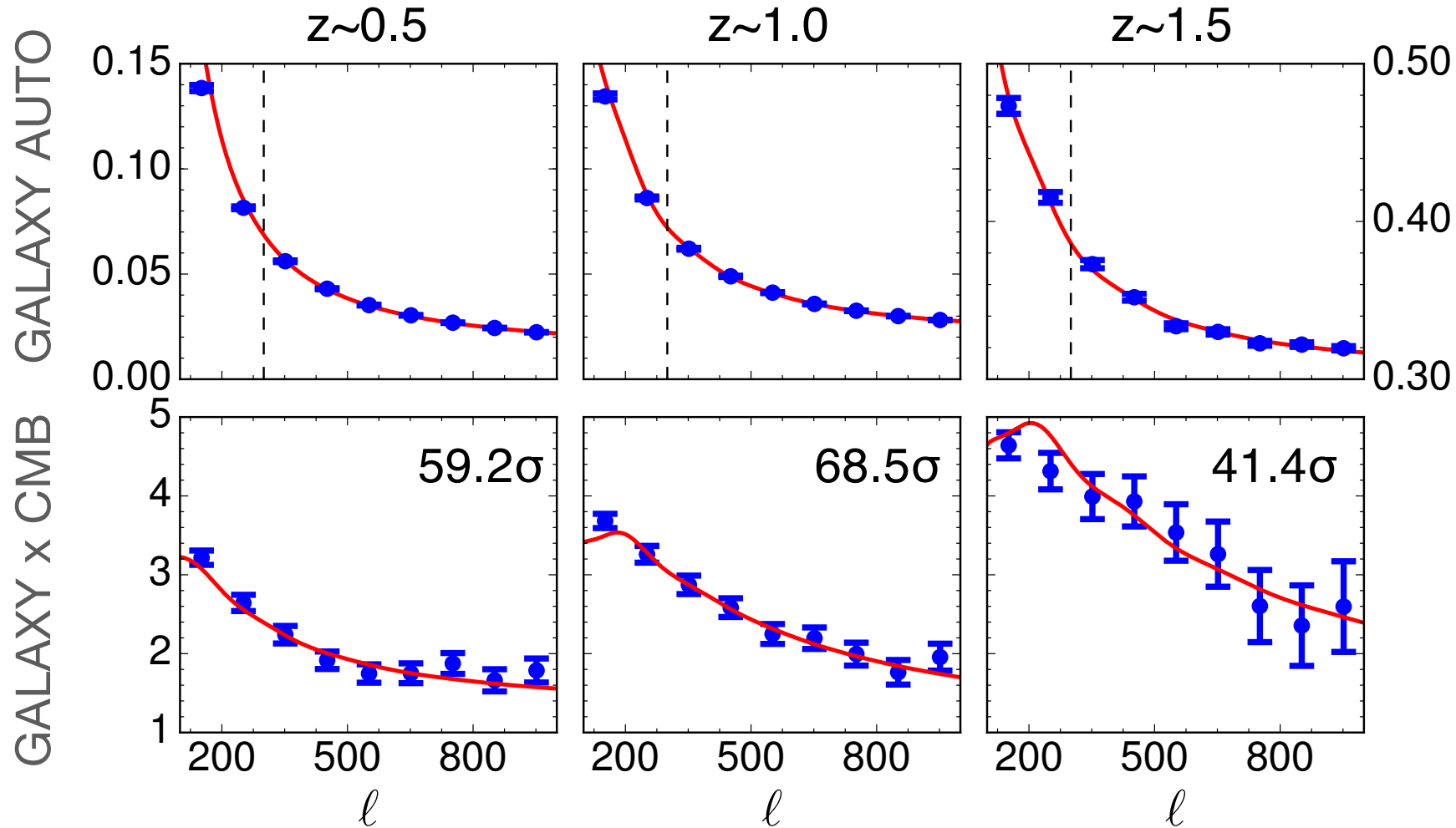
- Planck 2018 minimum-variance lensing maps + masks



*Planck 2018, arxiv: 1807.06210*



# AUTO & CROSS SPECTRA



- Model with Halofit x linear bias (+magnification bias)

$$P_{\text{mg}}(k, z) = b_{\text{lin}}(z)P_{\text{mm}}(k, z) \quad P_{\text{gg}}(k, z) = b_{\text{lin}}^2(z)P_{\text{mm}}(k, z) + \text{Shot Noise}$$

- Total S/N = 79.3

# INTERPRETATION CHALLENGES

---

- (few) Percent-level precision demands tight systematic control!
- Major systematics in this work:
  - unWISE redshift distribution
  - extra systematic power at large scales in auto-correlation (and its coupling to the mask)
  - modeling nonlinearities



# MEASURING THE REDSHIFT DISTRIBUTION

- Photometric redshifts impossible with 2 bands
- Matching to COSMOS photo-z yields approximate  $dN/dz$  but suffers from small area, photo-z errors, blending issues
- Alternative:  $dN/dz$  from cross-correlations with SDSS spectroscopic surveys (e.g. Menard et al. 2013)

$$\bar{w}_{\text{sp}}(z) = b_{\text{sml},\text{s}}(z) b_{\text{sml},\text{p}}(z) H(z) \frac{dN_{\text{p}}}{dz} I(z)$$

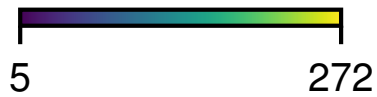
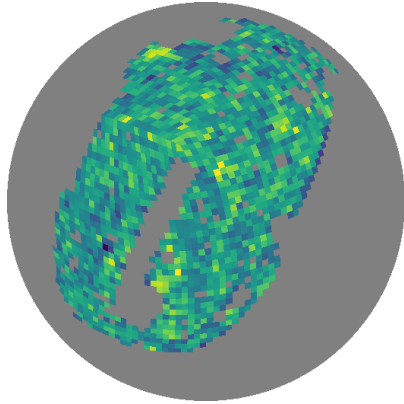
- Constrains  $b(z) dN/dz$ : you need  $b(z)$  as well as  $dN/dz$  for galaxy kernel!

$$C_{\ell}^{\kappa g} = \int d\chi \frac{b(z) dN/d\chi W^{\kappa}(\chi)}{\chi^2} P(k\chi = \ell + 1/2)$$

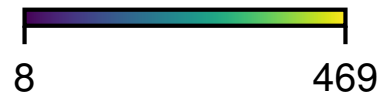
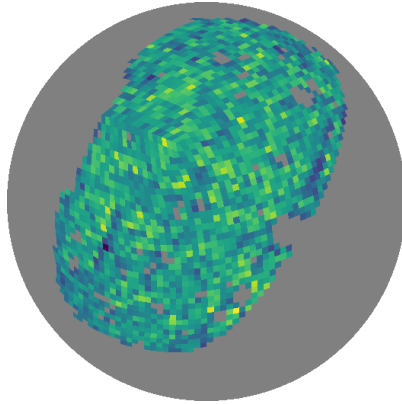
$$C_{\ell}^{gg} = \int d\chi \frac{[b(z) dN/d\chi]^2}{\chi^2} P(k\chi = \ell + 1/2)$$

# SPECTROSCOPIC SAMPLES

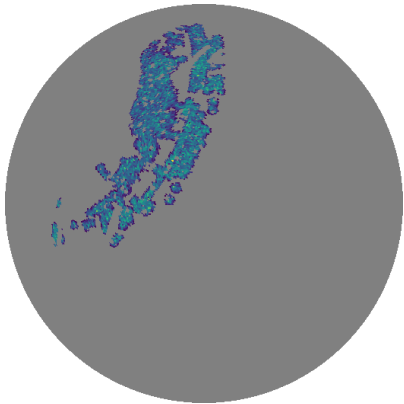
LOWZ



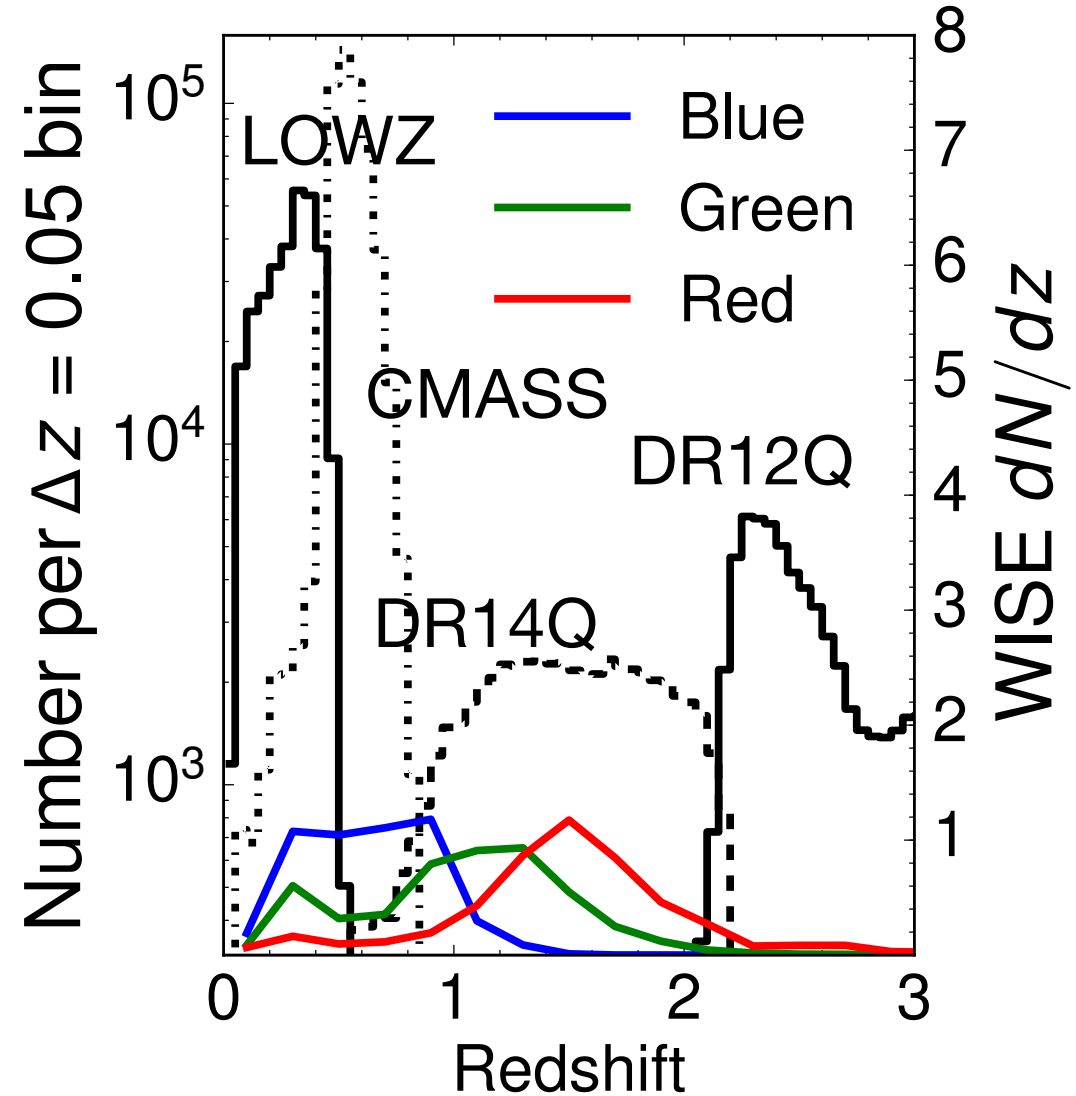
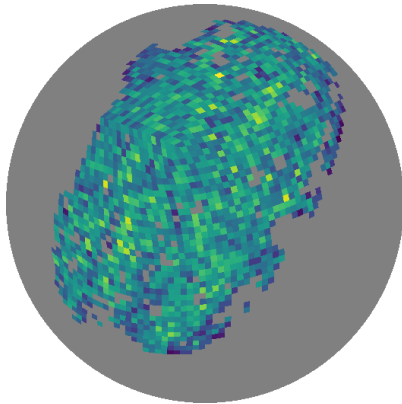
CMASS



DR14Q



DR12Q



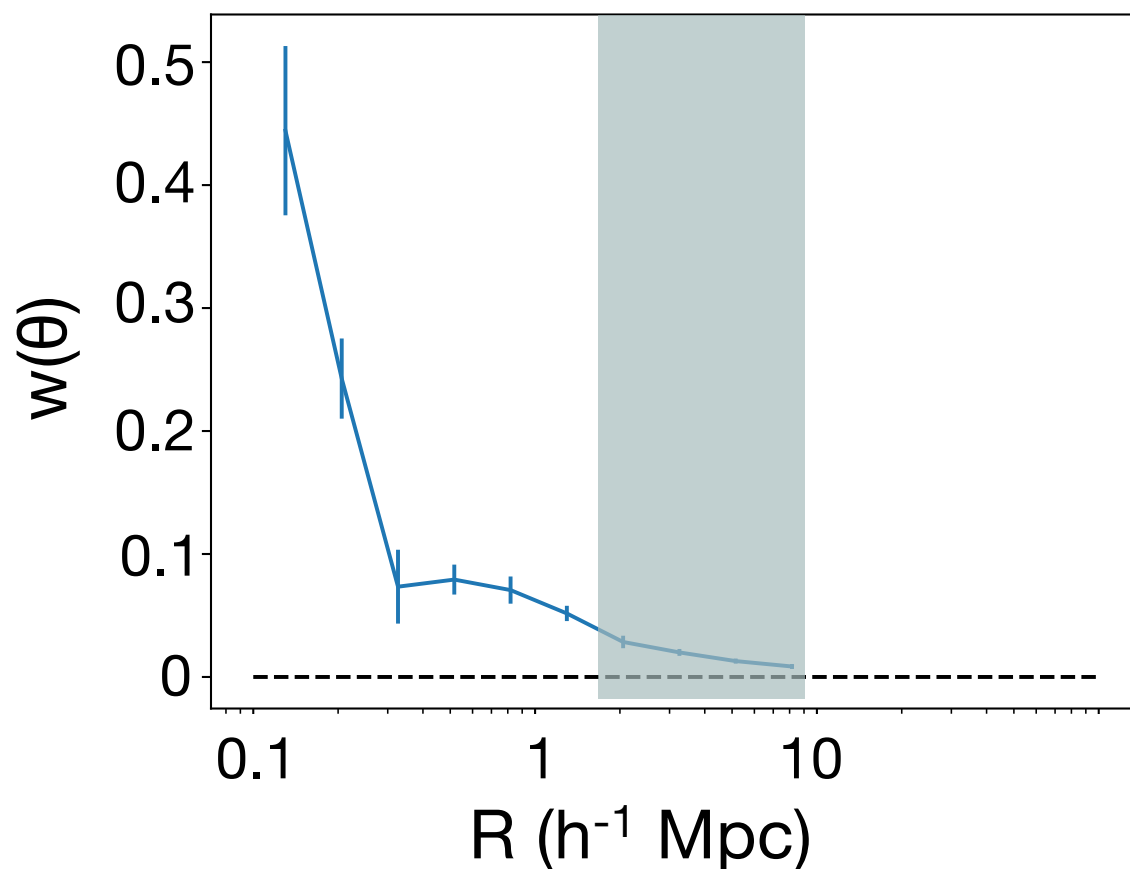
# CLUSTERING REDSHIFT METHOD

---

- Real-space method as in Menard et al., 2013

$$\hat{w}(\theta) = \frac{D_s D_p}{D_s R_p} \frac{N_R}{N_D} - 1$$

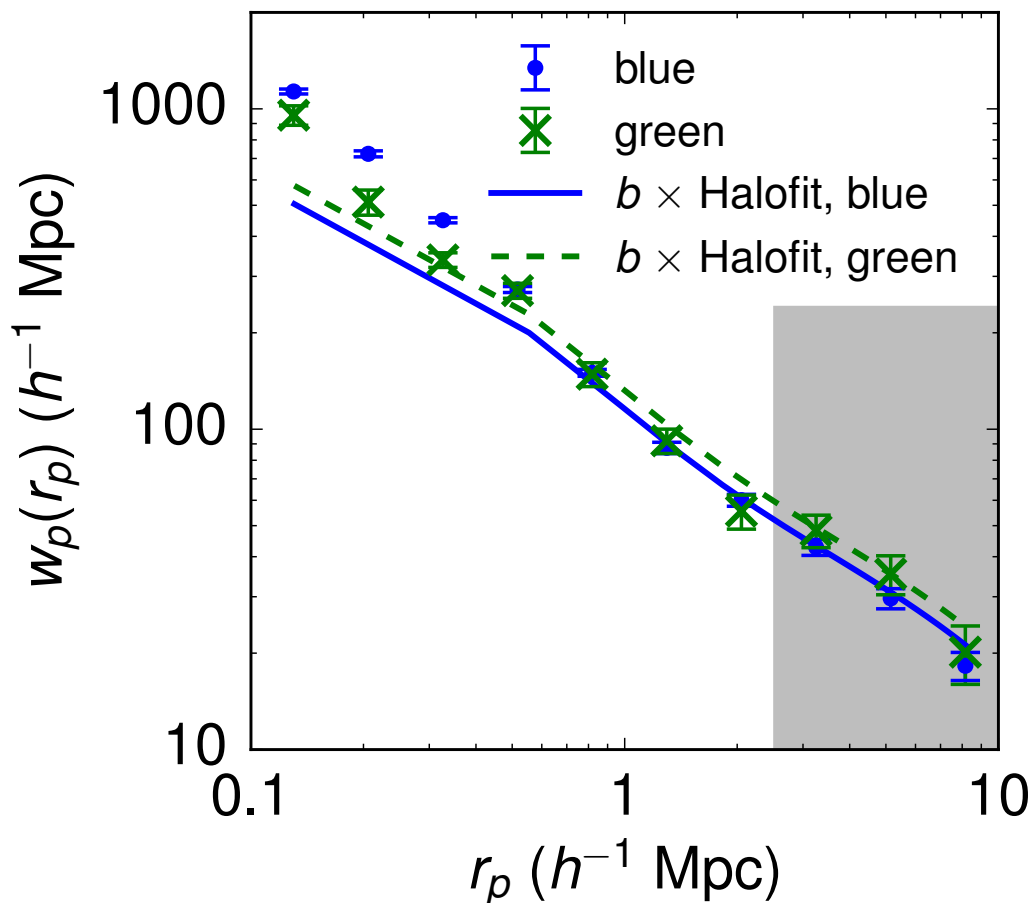
Green x DR14Q,  $1.4 < z < 1.6$



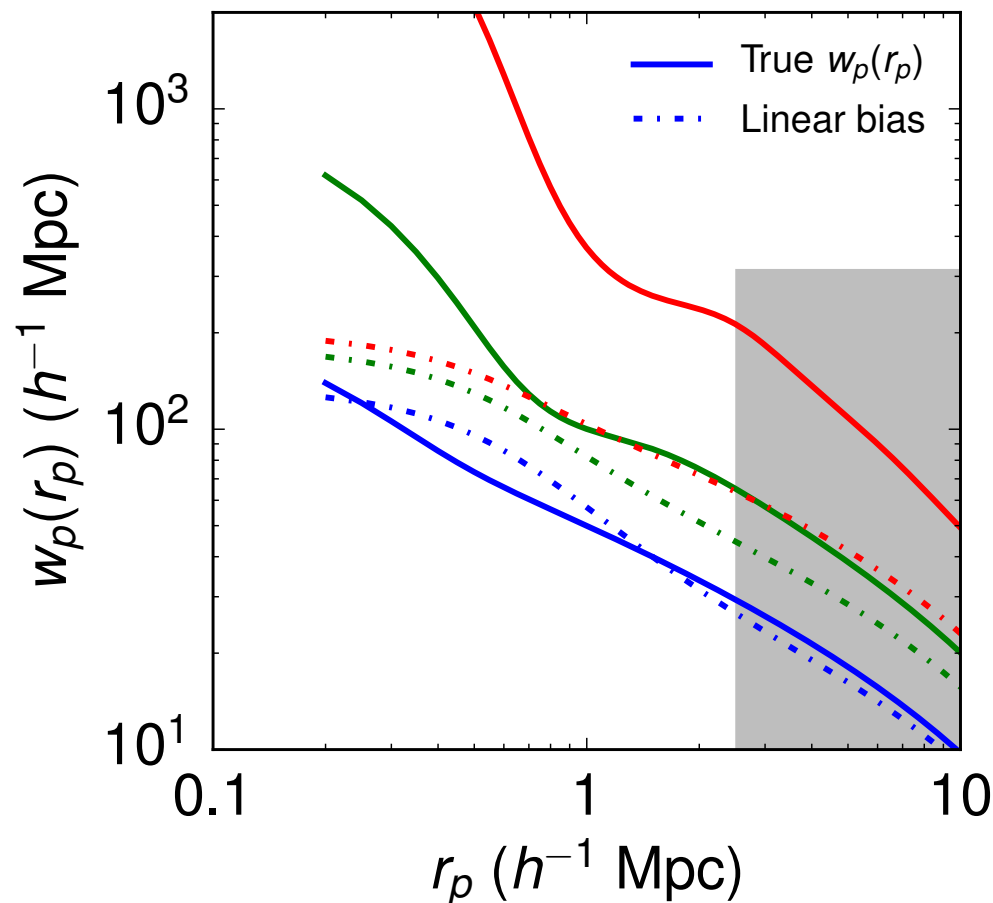
# HOW TO DETERMINE SCALE CUT?

- Scales used in clustering redshifts should match scales used in  $C_{\ell}^{\text{gg}}$ ,  $C_{\ell}^{\text{kg}}$  as well as possible

LOWZ  $\times$  WISE,  $z = 0.40 - 0.45$



*N*-body HOD Autocorrelation

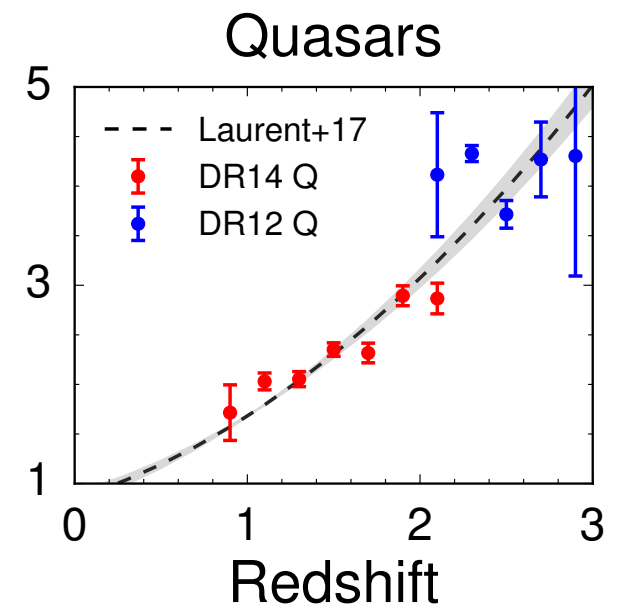
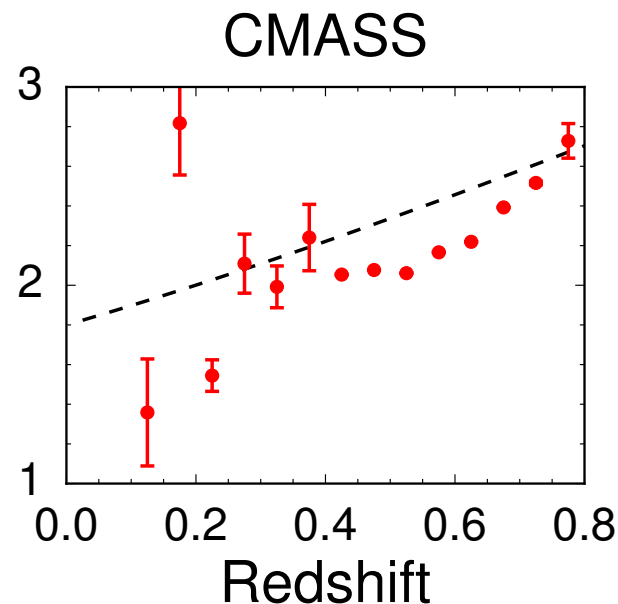
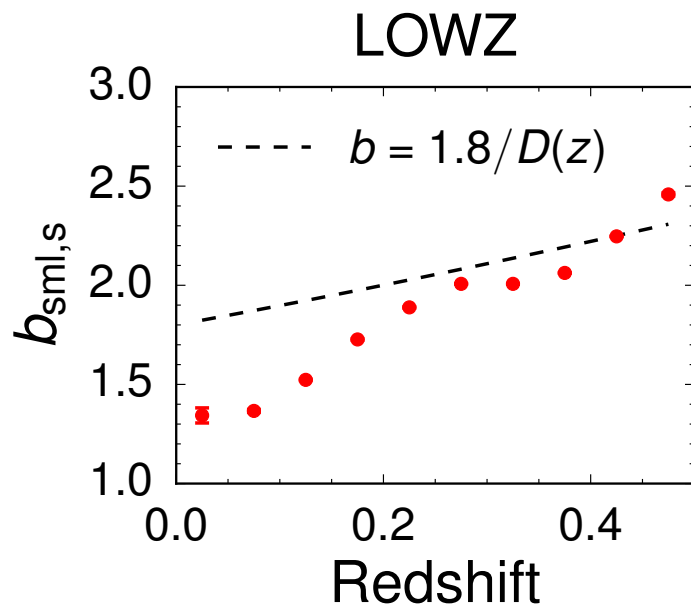




# SPECTROSCOPIC BIAS EVOLUTION

$$\bar{w}_{\text{sp}}(z) = b_{\text{sml},s}(z) b_{\text{sml},p}(z) H(z) \frac{dN_{\text{p}}}{dz} I(z)$$

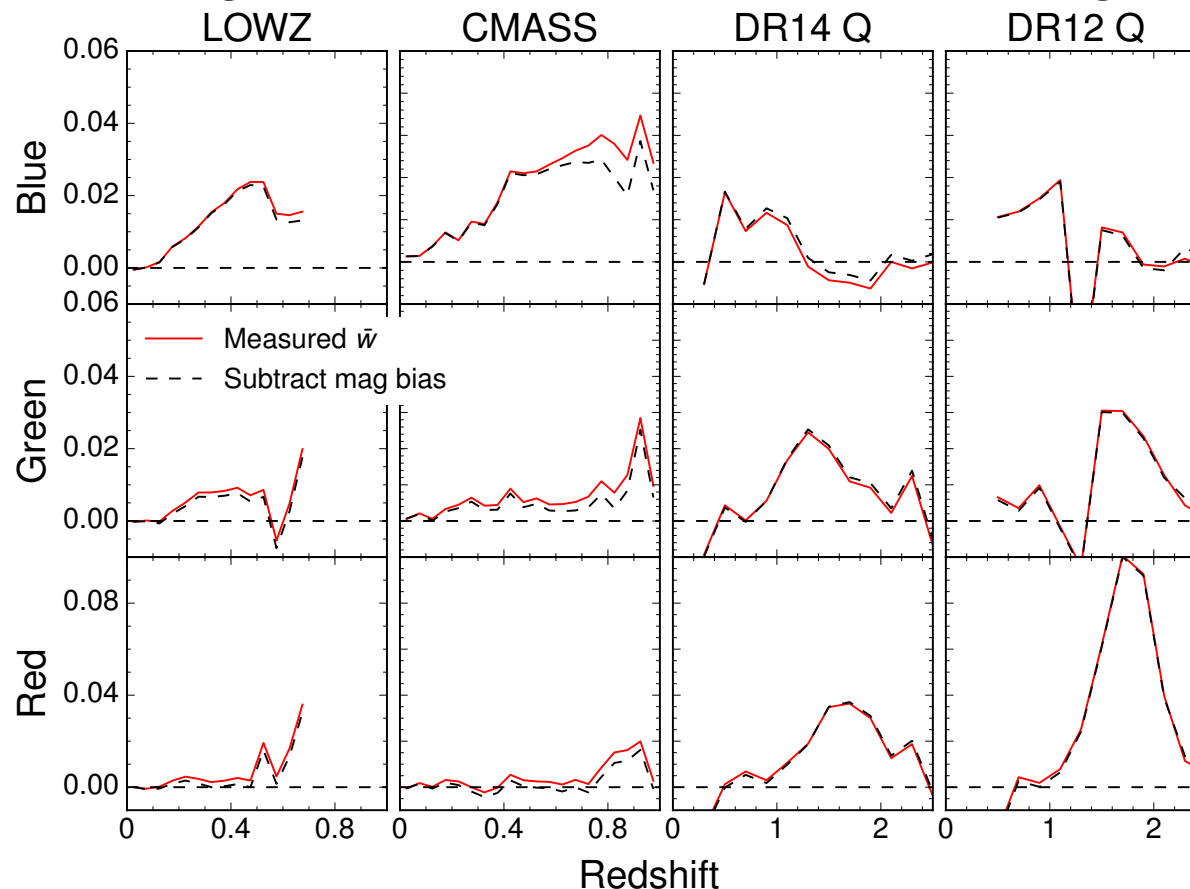
- Passive evolution models are not correct in detail for the spectroscopic samples



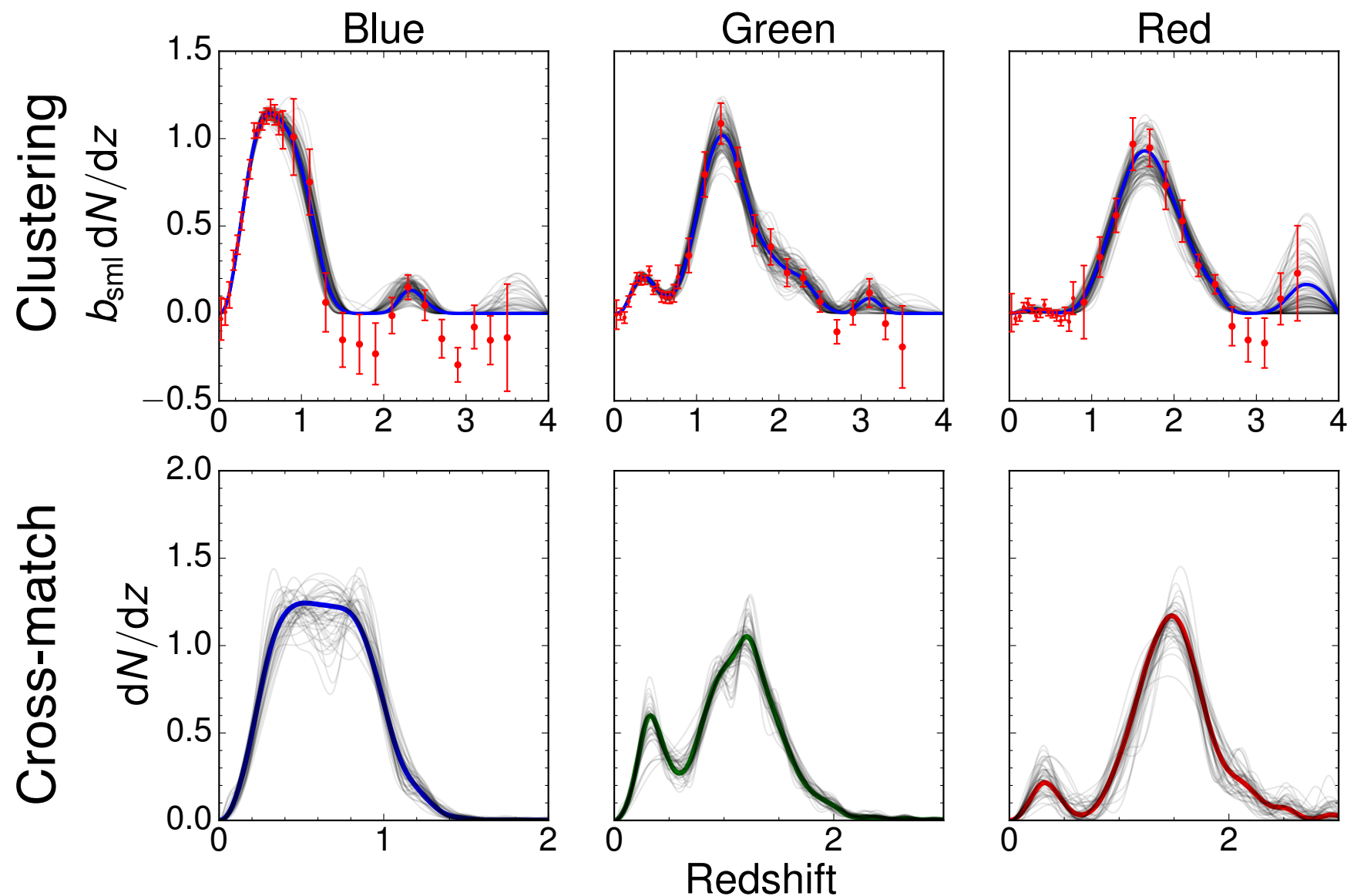
# IMPACT OF MAGNIFICATION BIAS

- Photo-spectro cross-correlations may also be due to lensing magnification bias (particularly in tails)
- Neglecting magnification bias shifts results by  $\sim 1$  sigma

## Clustering $dN/dz$ with and without mag bias



# COMBINED $dN/dz$



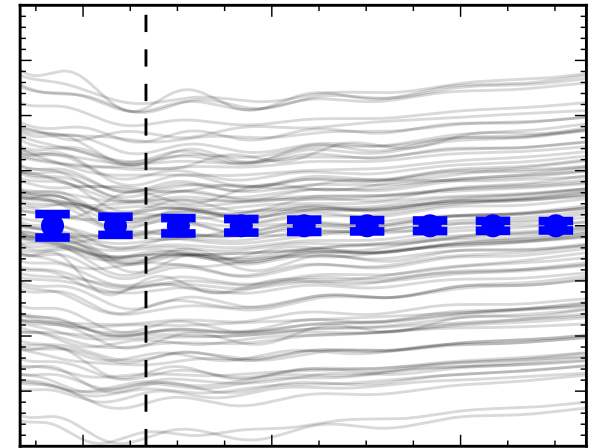
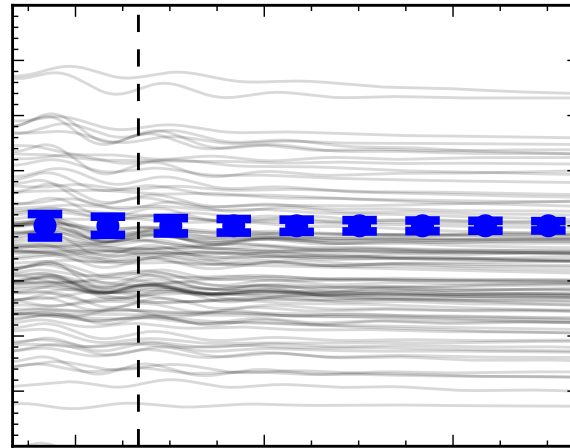
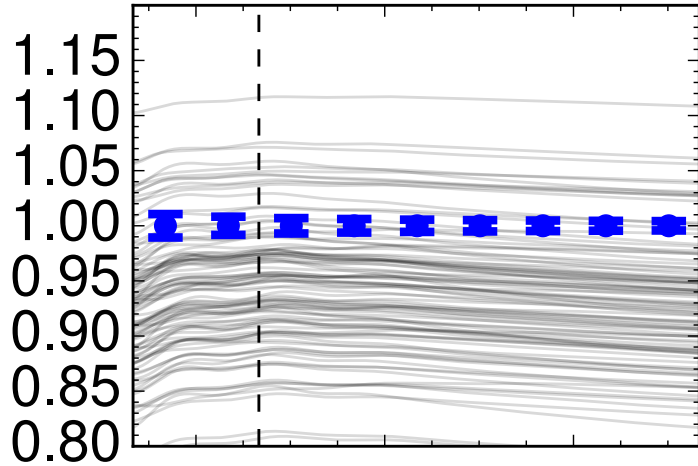
# IMPACT OF UNCERTAIN $dN/dz$ ON POWER SPECTRA

Blue

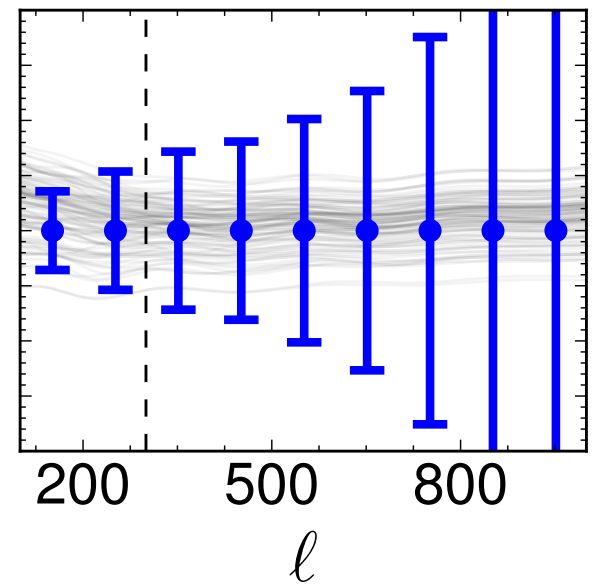
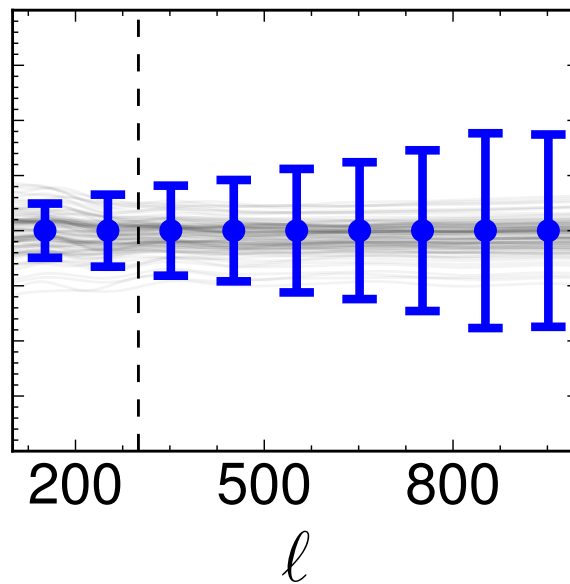
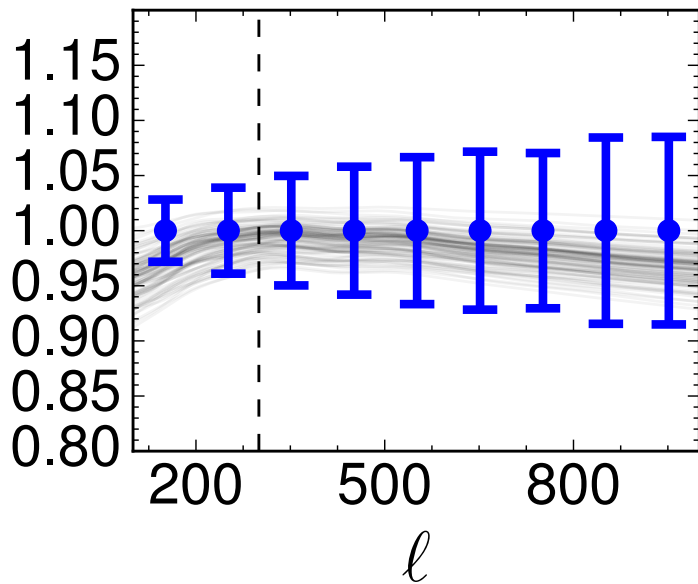
Green

Red

GALAXY AUTO



GALAXY x CMB



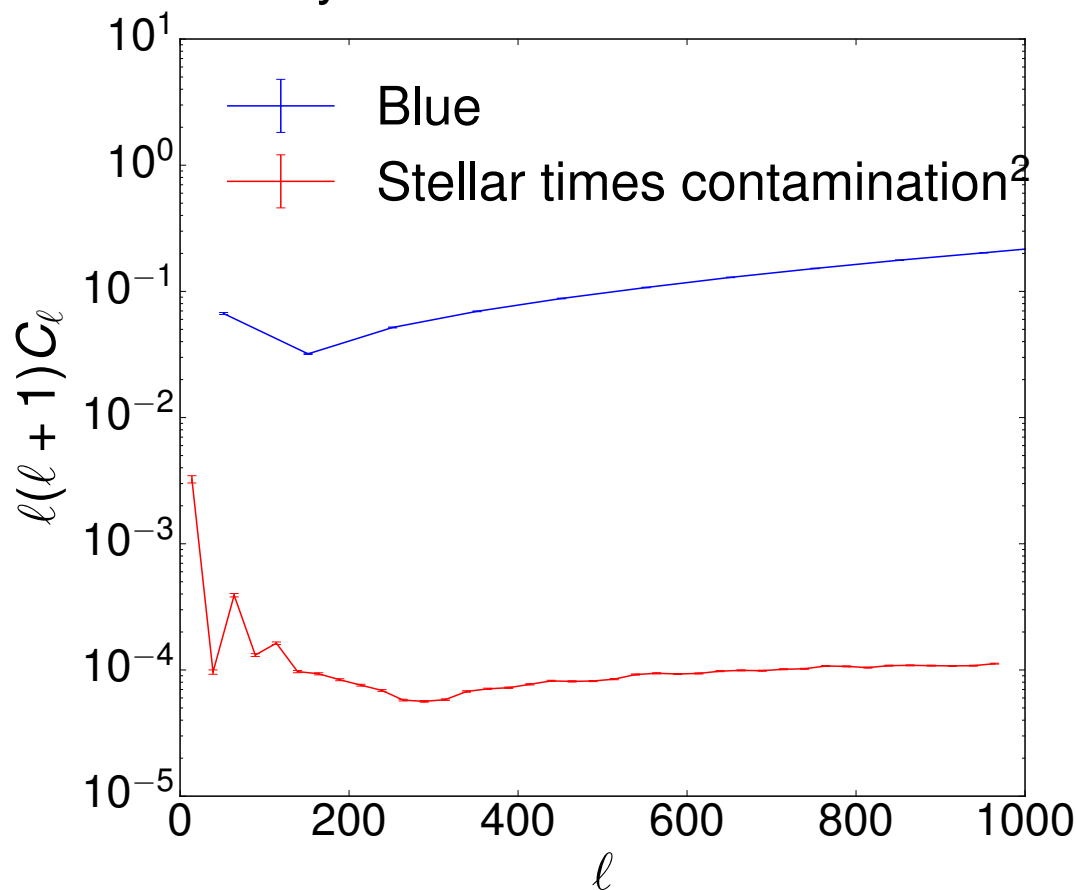
# STELLAR CONTAMINATION

- If stars are unclustered, the effect of stellar contamination on number density is degenerate with bias

- $\epsilon_s$  : stellar contamination fraction

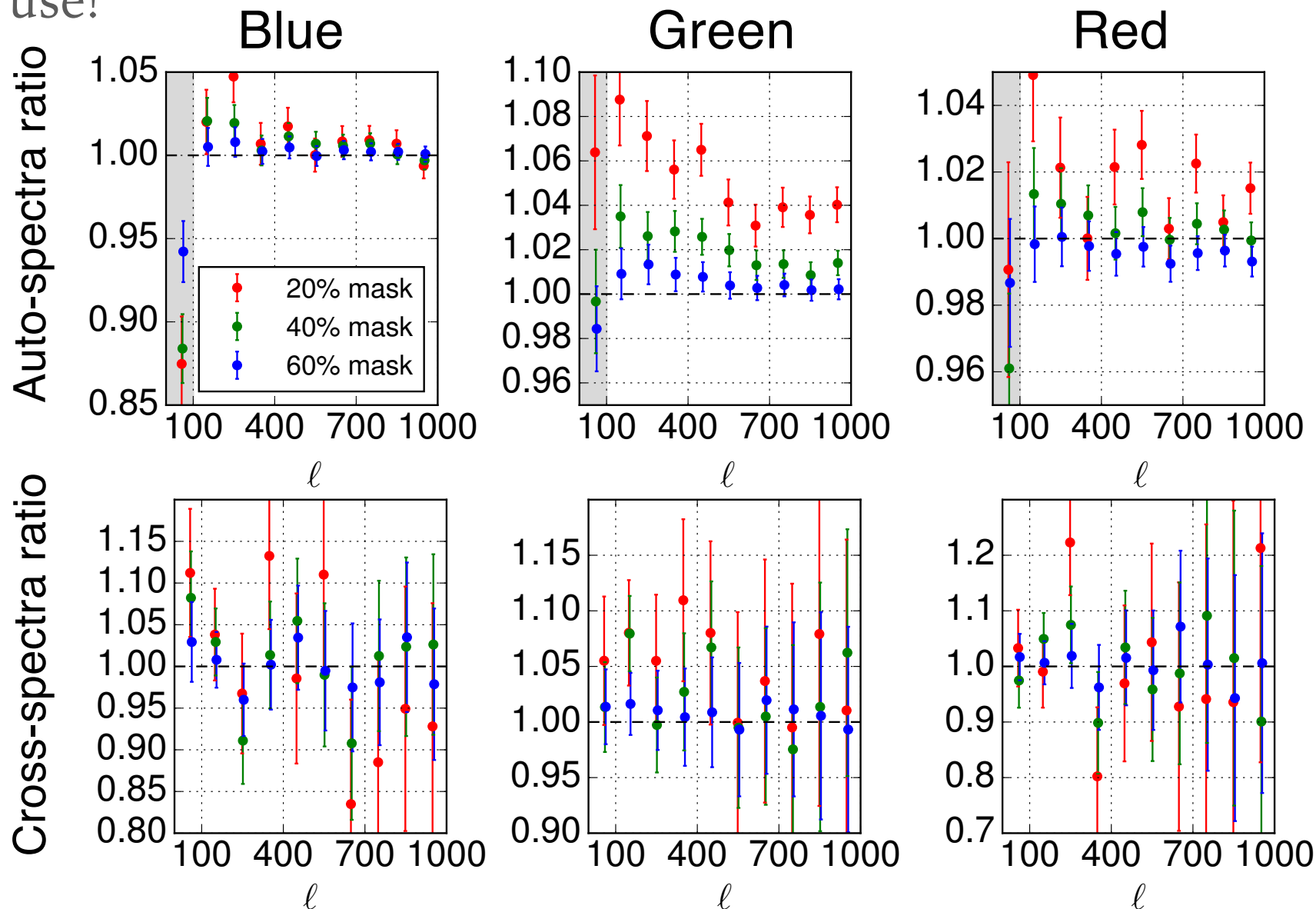
$$b^{\text{eff}} = b^{\text{true}} \frac{1}{1 + \epsilon_s}$$

Galaxy vs stellar contamination auto



# CHANGING THE GALACTIC MASK

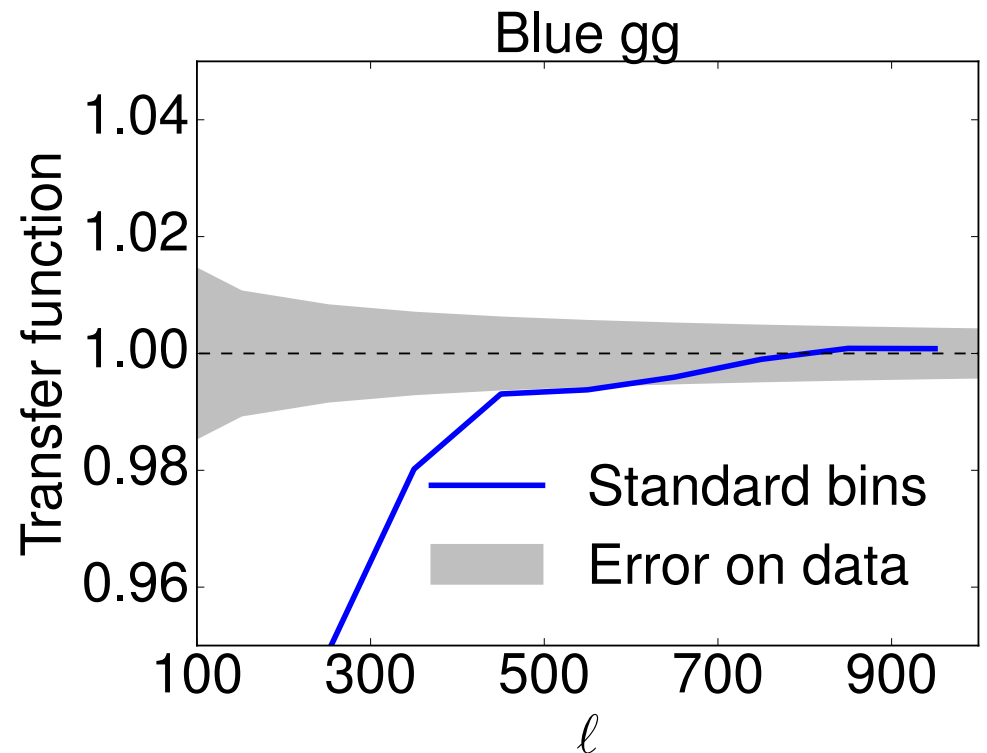
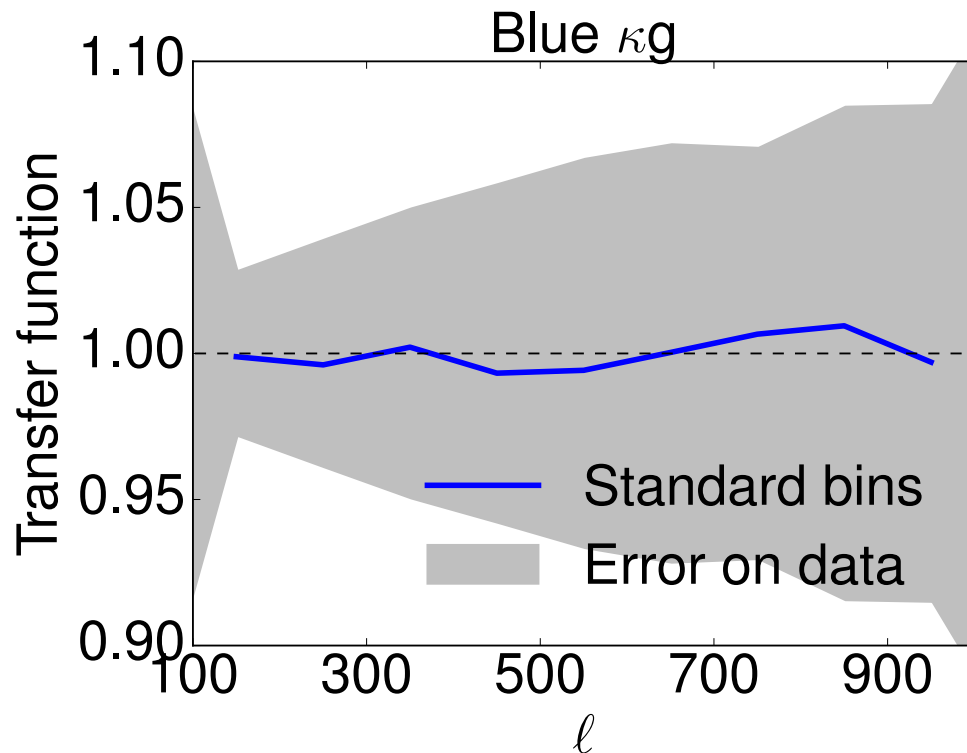
- .....
- $\ell < 100$  in auto shows trends with masking choice: do not use!



# TESTING THE MASK DECONVOLUTION

---

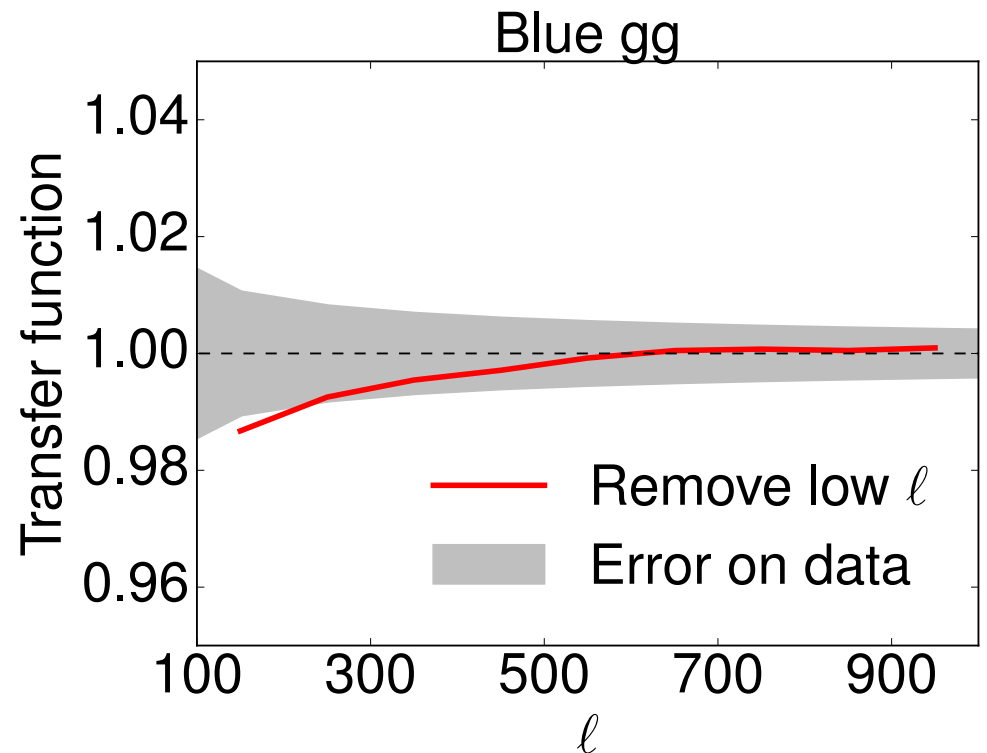
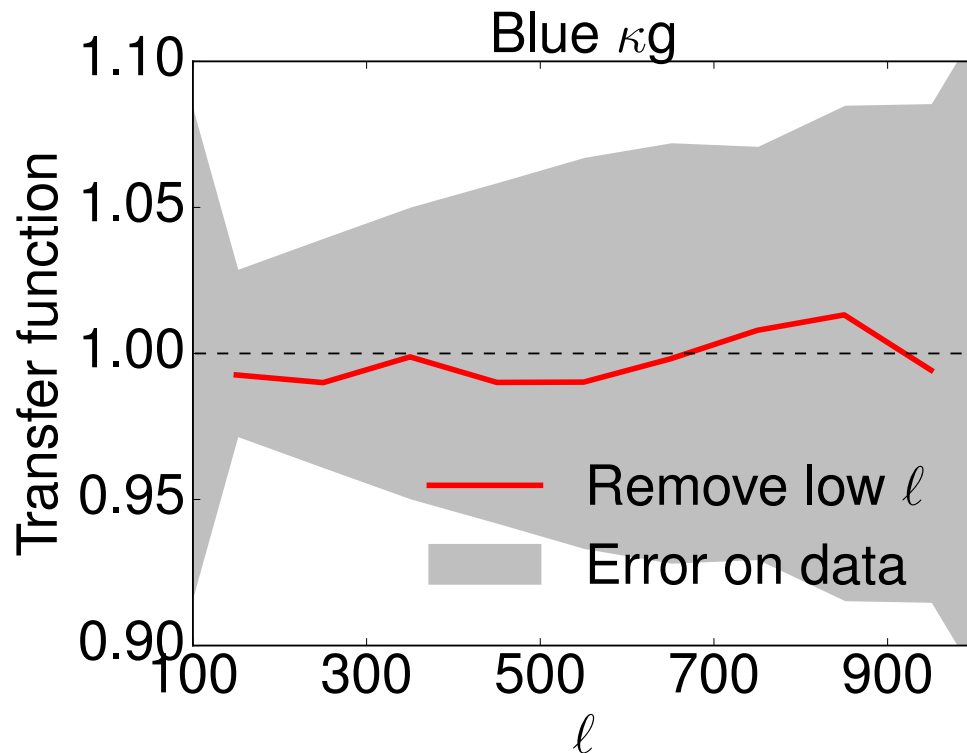
- One danger from stellar contamination: coupling between the galaxy mask and the signal
- Test mask deconvolution by creating mock Gaussian realizations of galaxy & CMB lensing fields
- Mask, measure pseudo- $C_\ell$ , deconvolve mask  $\rightarrow$  compare to input  $C_\ell$



# TESTING THE MASK DECONVOLUTION

---

- One danger from stellar contamination: coupling between the galaxy mask and the signal
- Test mask deconvolution by creating mock Gaussian realizations of galaxy & CMB lensing fields
- Mask, measure pseudo- $C_\ell$ , deconvolve mask  $\rightarrow$  compare to input  $C_\ell$

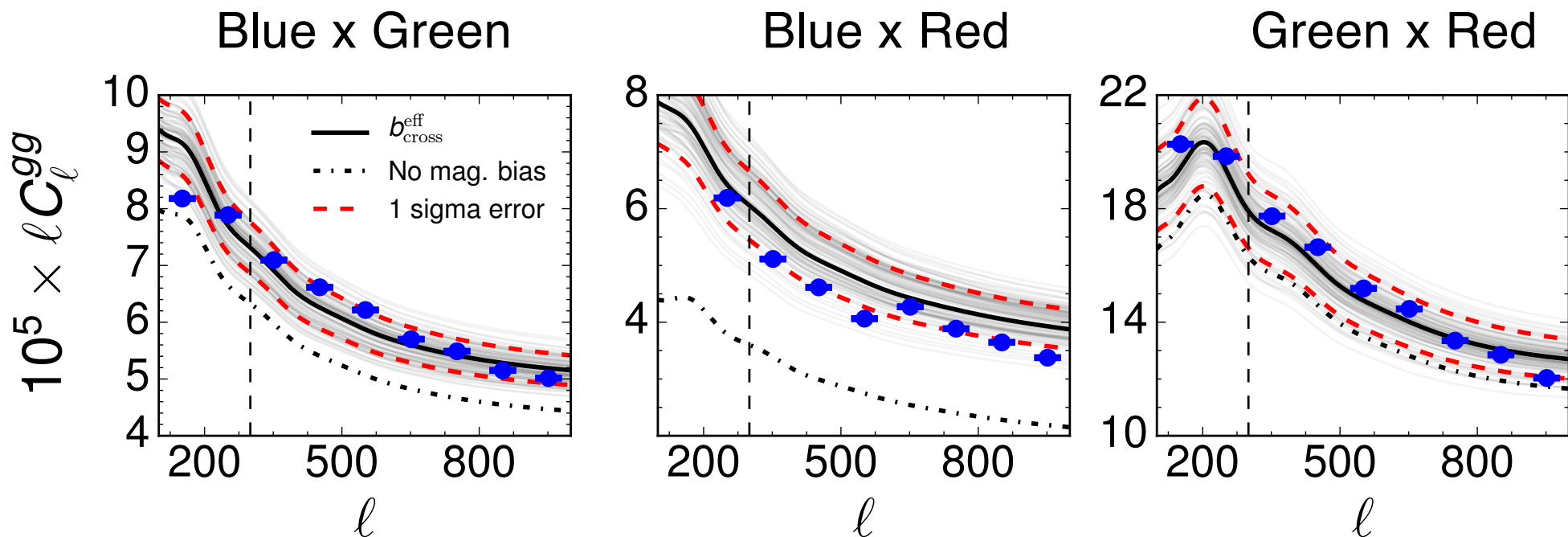




# GALAXY CROSS SPECTRA

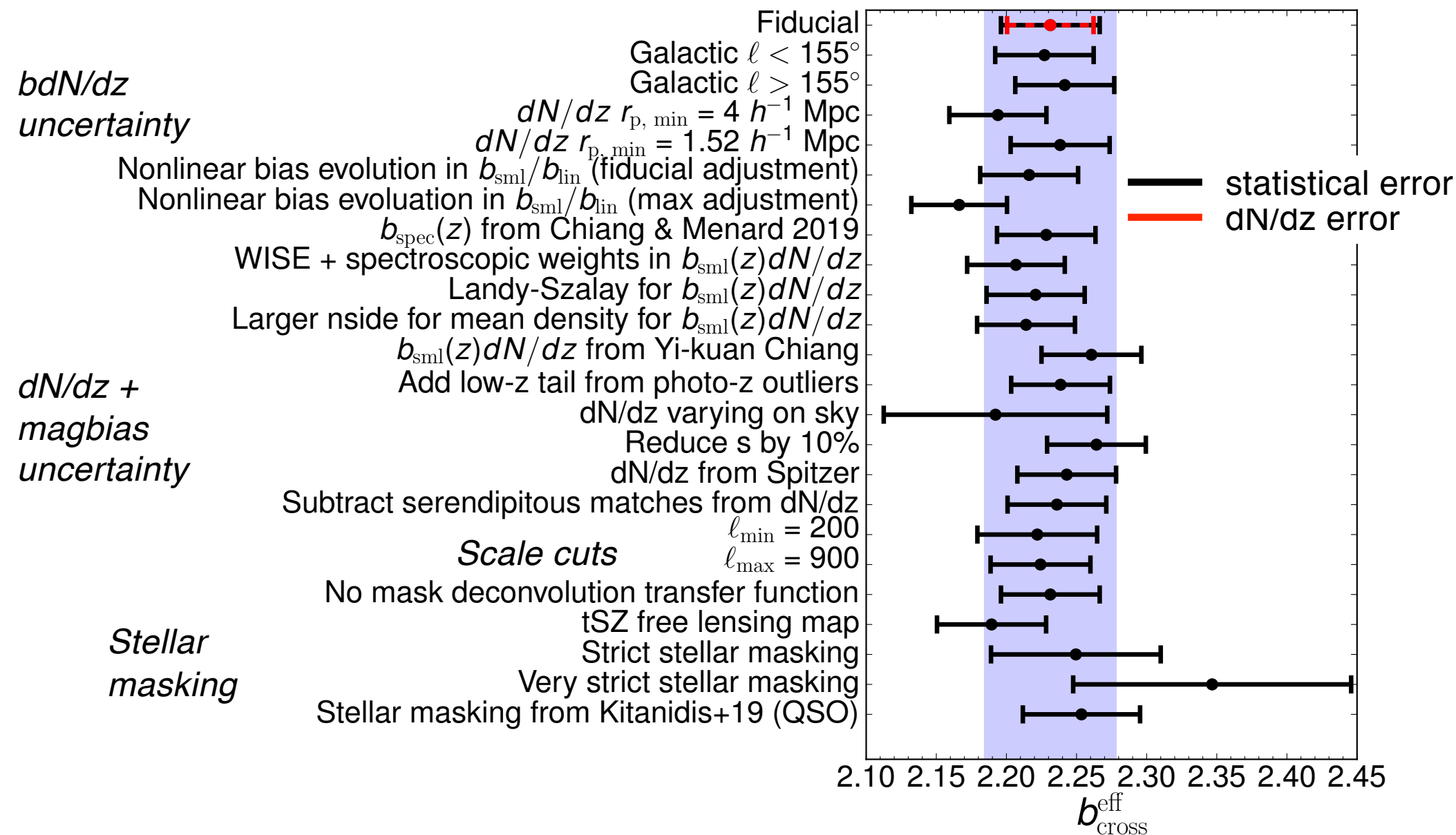
---

- Use best-fit biases from CMB lensing cross-correlations to predict theory curves for cross spectra
- Reasonably consistent; requires some fraction of green and red galaxies to inhabit the same halos (cross shot-noise)



# SYSTEMATICS SUMMARY

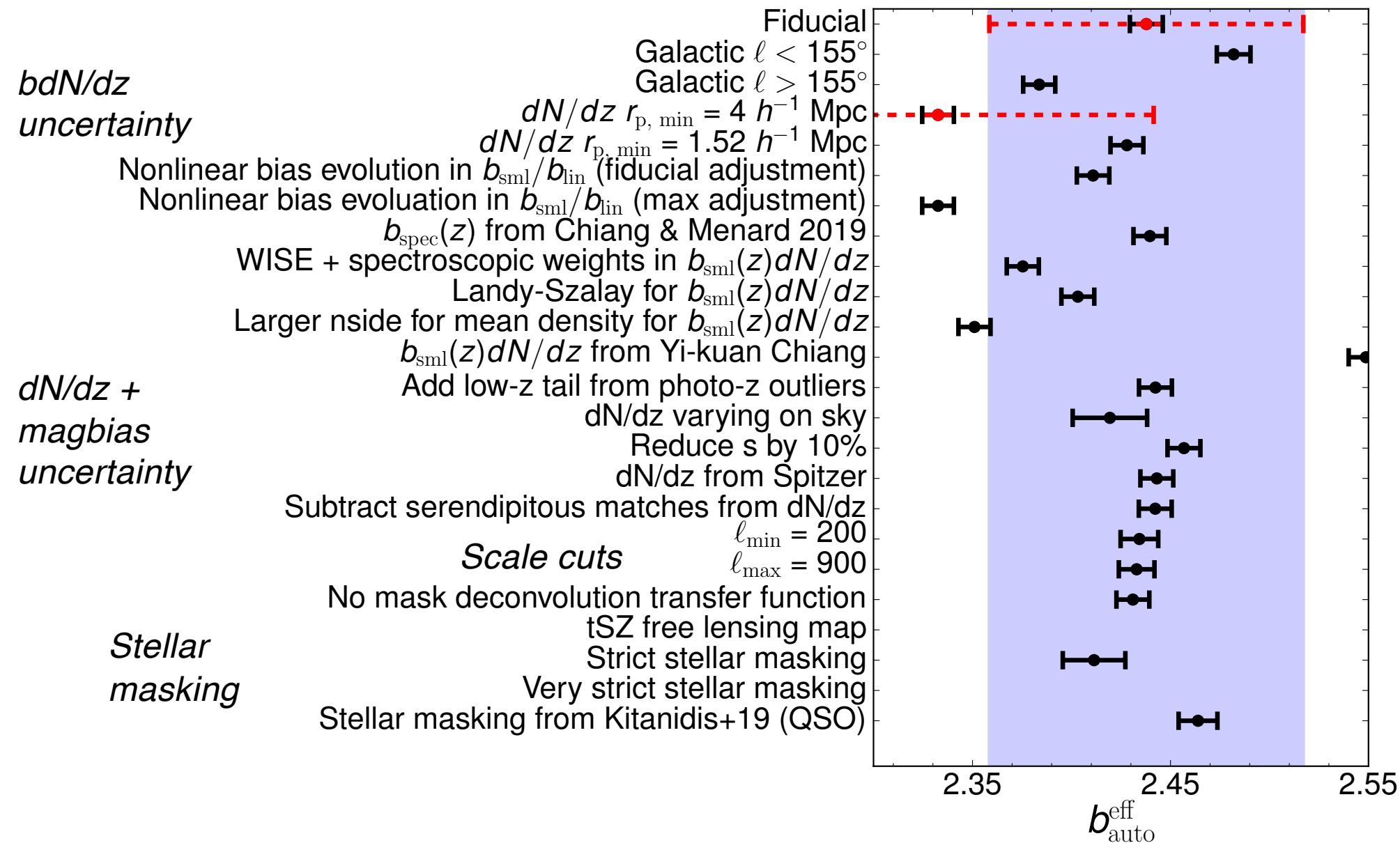
## Green cross CMB lensing



# SYSTEMATICS SUMMARY

— statistical error  
— dN/dz error

## Green autocorrelation

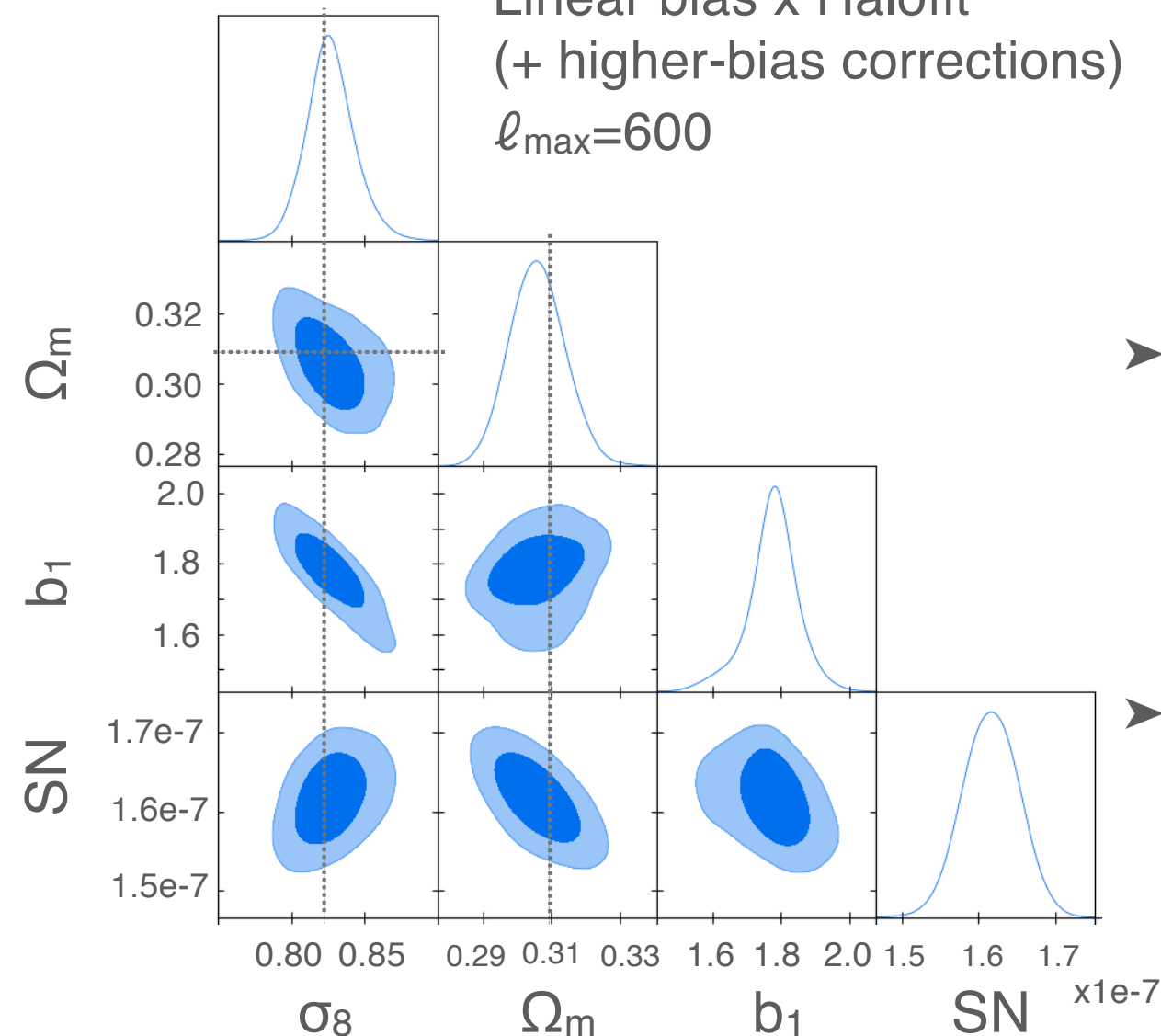


# CONSTRAINING COSMOLOGY

PRELIMINARY  
MOCKS

$z \sim 1$  sample, mock data

Linear bias x Halofit  
(+ higher-bias corrections)  
 $\ell_{\max}=600$

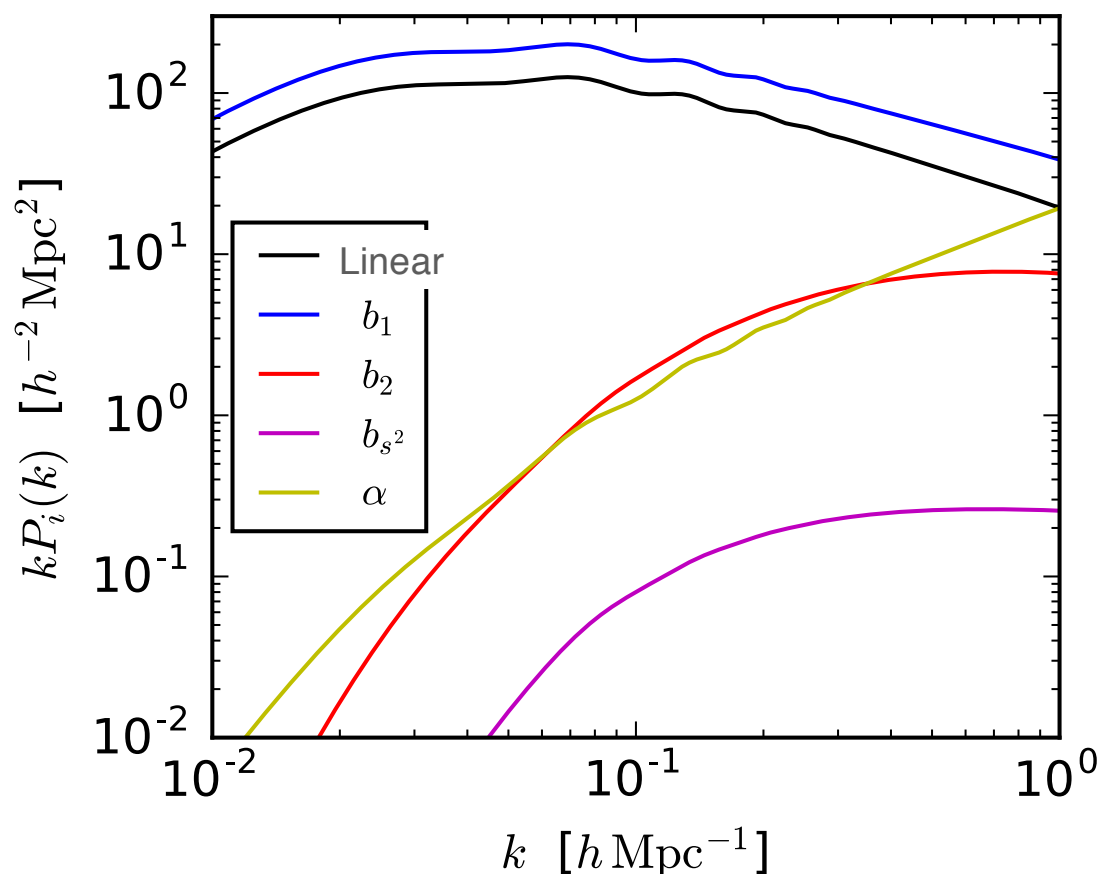


- Create mock dataset to test cosmology pipeline and impact of nonlinearities and uncertain  $dN/dz$
- Model also marginalizes over uncertain magnification bias and redshift distribution
- Currently: testing on different HODs, redshift distributions

# NONLINEAR BIAS MODEL

- Lagrangian PT + bias + EFT: CLEFT (Modi, White & Vlah 2017)

$$P_{mg}(k) = \left(1 - \frac{\alpha_{\times} k^2}{2}\right) P_{\text{Zel'dovich}} + P_{1\text{-loop}} + \frac{b_1}{2} P_{b_1} + \frac{b_2}{2} P_{b_2} + \frac{b_{s^2}}{2} P_{b_{s^2}} + \frac{b_{\nabla^2}}{2} P_{b_{\nabla^2}} + s_{\times}$$

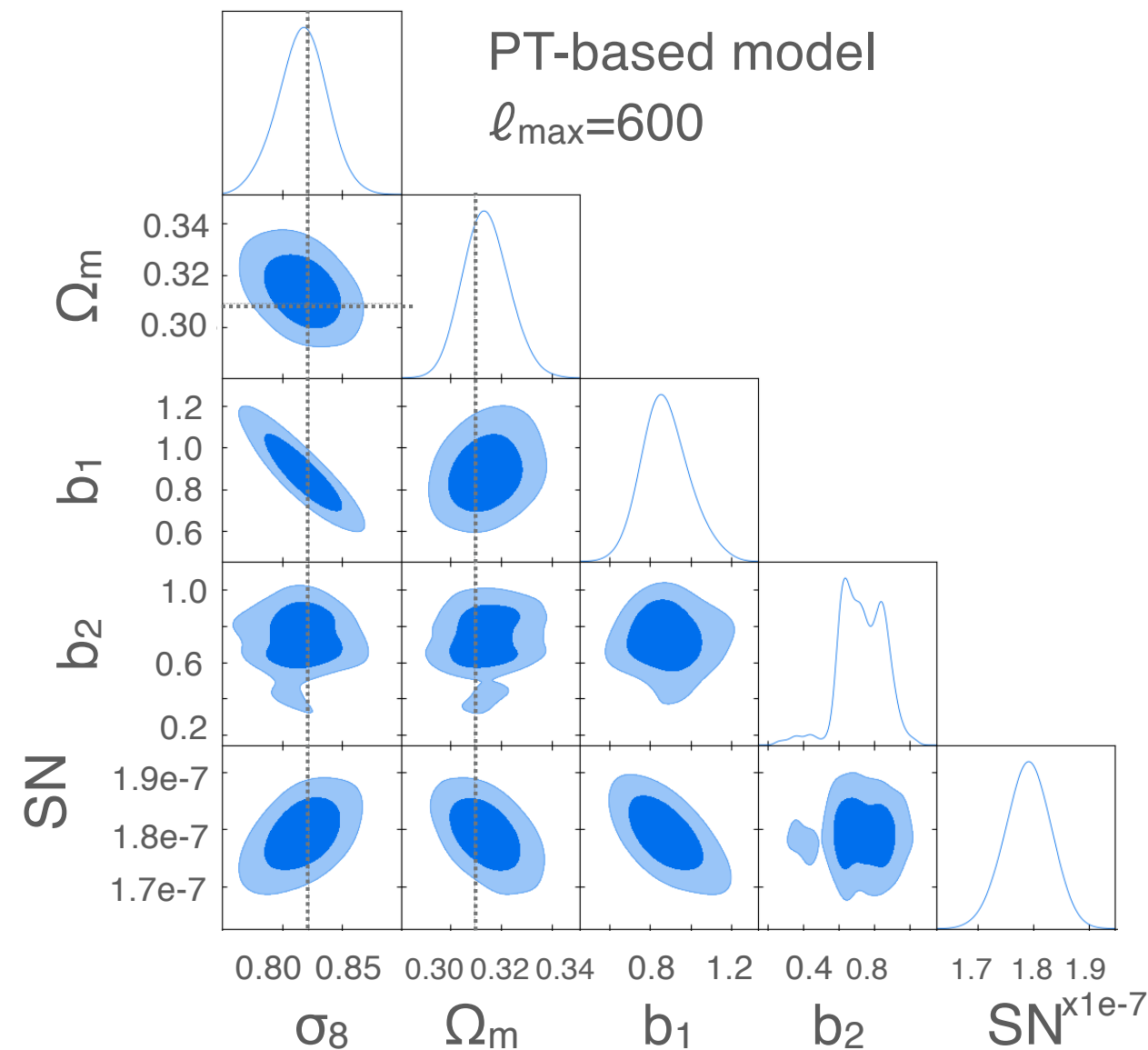


# CONSTRAINING COSMOLOGY

PRELIMINARY  
MOCKS

$z \sim -1$  sample, mock data

- Still working out kinks with PT model: volume effects, counter-term, slightly worse  $\chi^2$  than Halofit



# CONCLUSIONS & NEXT STEPS

---

- CMB lensing cross-correlation with  $S/N \sim 80$  from 500 million galaxies at  $0 < z < 2$
- Presented methods, measurement & systematics checks
- Challenges and promise for cosmology at the few-percent precision
- Next steps:
  - sample over cosmological parameters: measure  $\Omega_m$  and  $\sigma_8$ , marginalizing over  $dN/dz$
  - say something interesting about lensing tension?

# BACKUP SLIDES

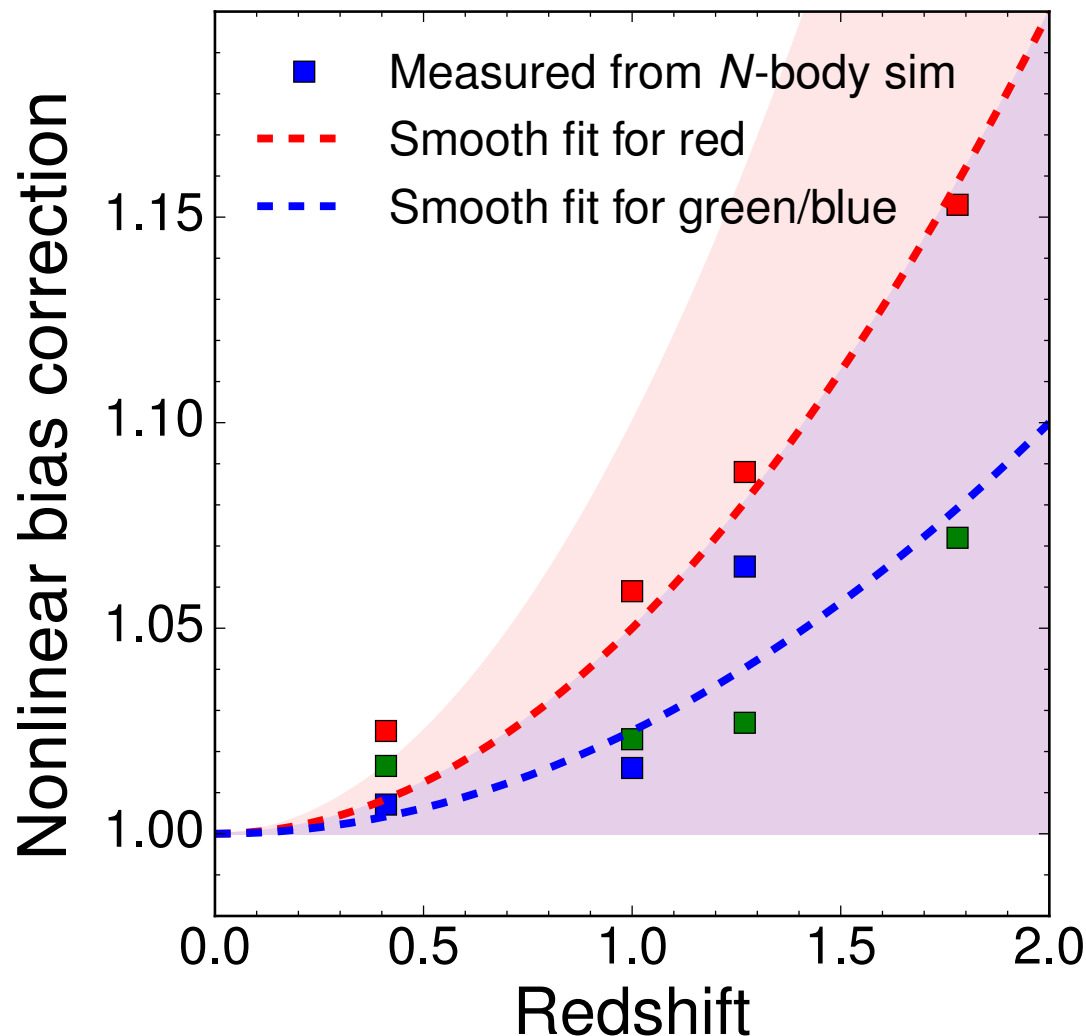
---



# NONLINEAR BIAS EVOLUTION

---

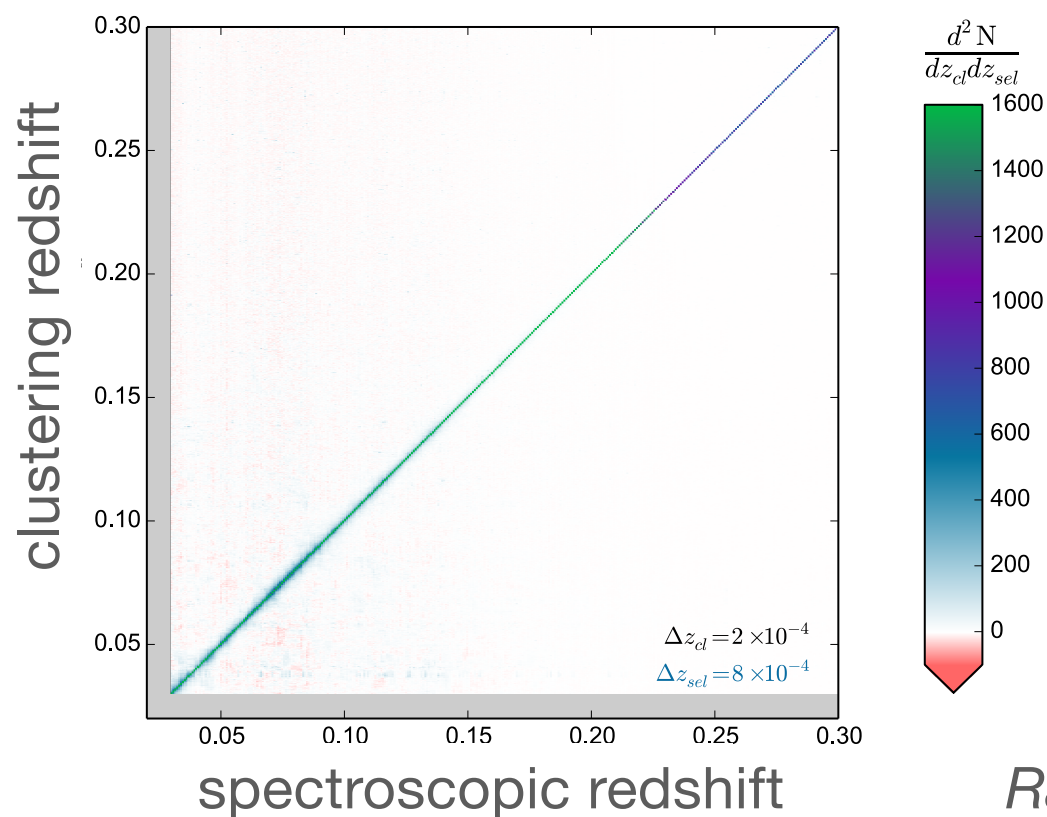
- Residual impact of nonlinear bias on  $2.5 < r < 10 \text{ h}^{-1} \text{ Mpc}$  is small



# unWISE REDSHIFT DISTRIBUTION

- Measure  $dN/dz$  from cross-correlations with SDSS

$$\bar{w}_{\text{sp}}(z) = b_{\text{sml},s}(z) b_{\text{sml},p}(z) H(z) \frac{dN_p}{dz} I(z)$$



*Rahman et al. 2015*

- cross-check with cross-correlations with SDSS
- cross-check with cross-correlations with SDSS

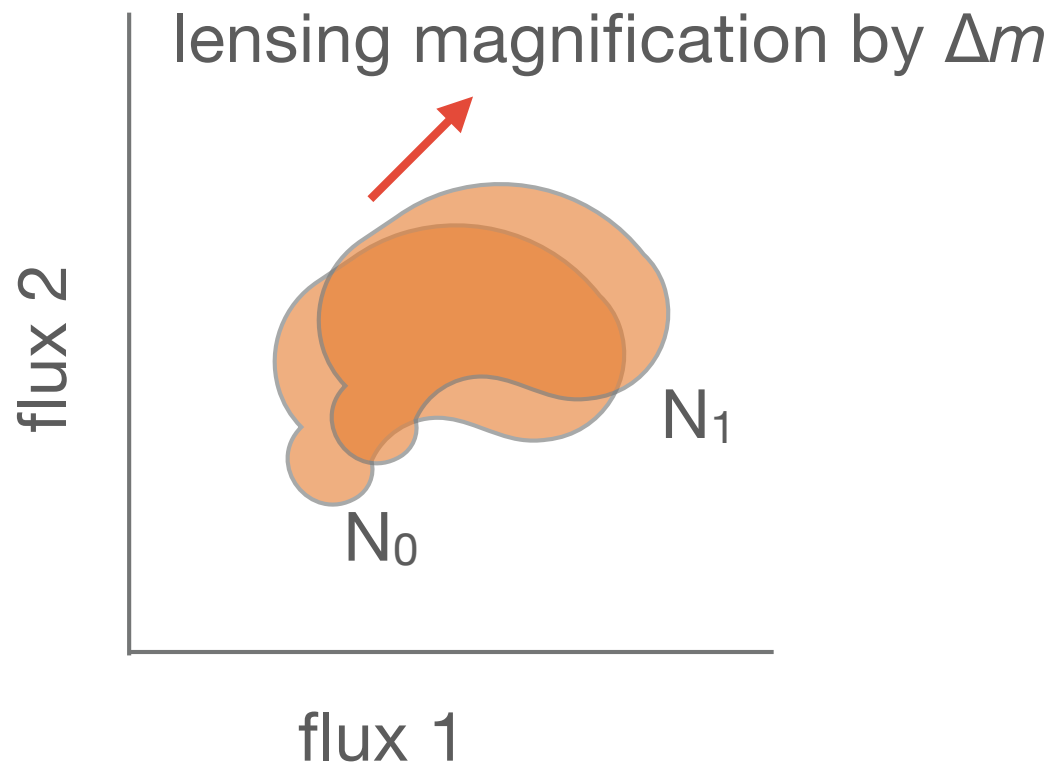
SDSS photo-z

# MEASURING $s$

---

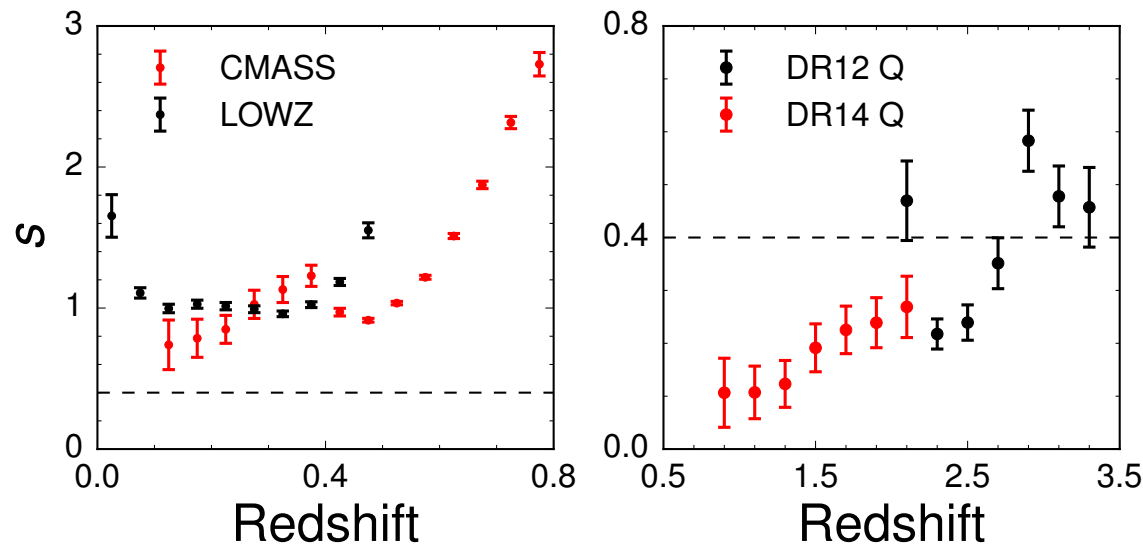
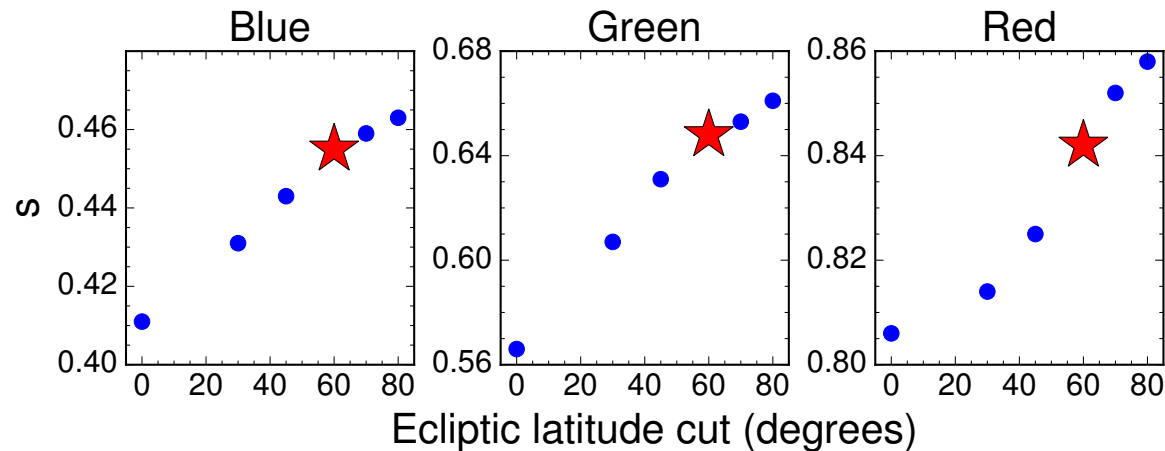
- $s$  is response of number density to lensing magnification

$$s \equiv \frac{\log_{10} N_1 - \log_{10} N_0}{\Delta m}$$

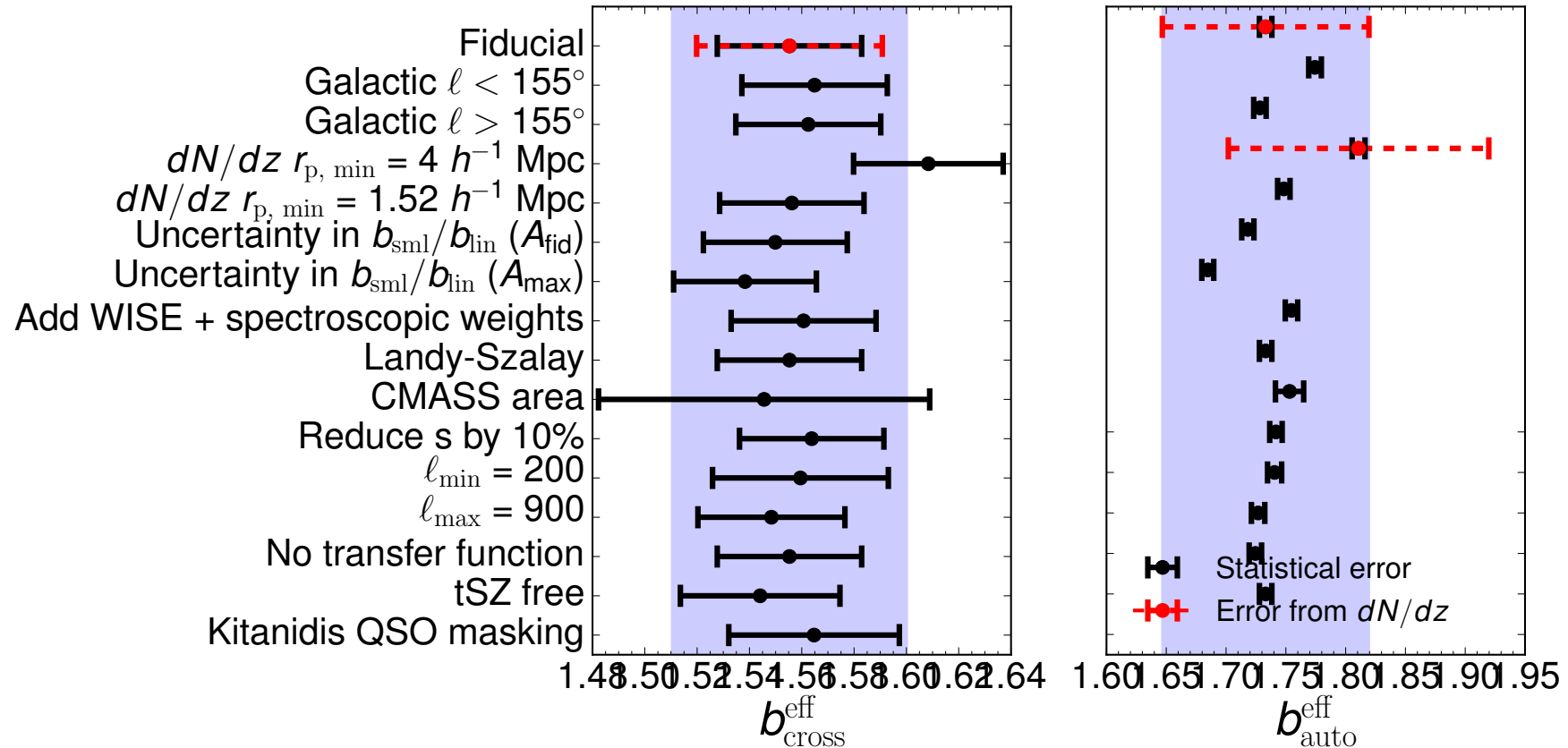


# MEASURING MAGNIFICATION BIAS

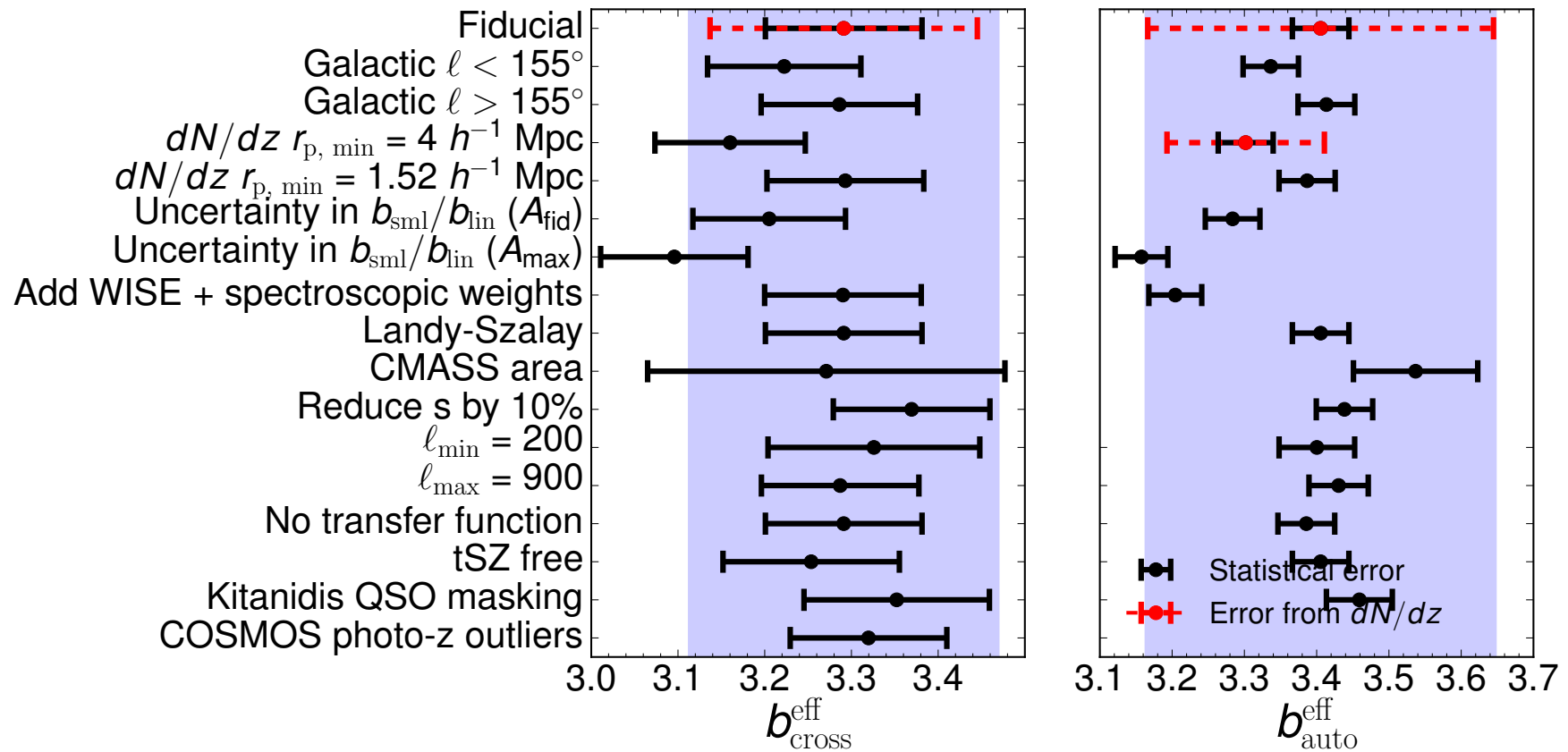
---



# SYSTEMATICS SUMMARY (BLUE SAMPLE)

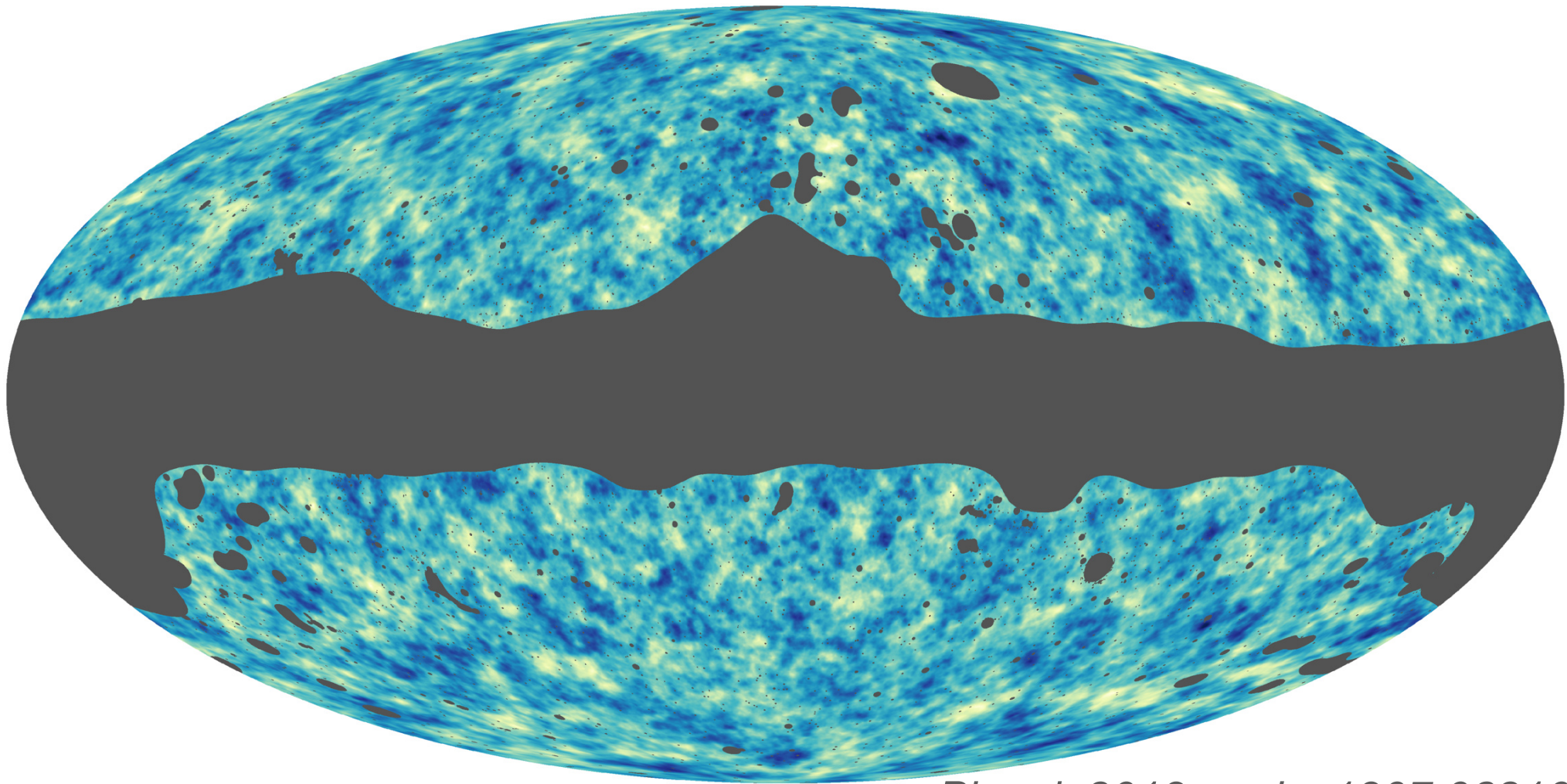


# SYSTEMATICS SUMMARY (RED SAMPLE)



# PLANCK LENSING MAP

► Auto-spectrum detected at  $40\sigma$



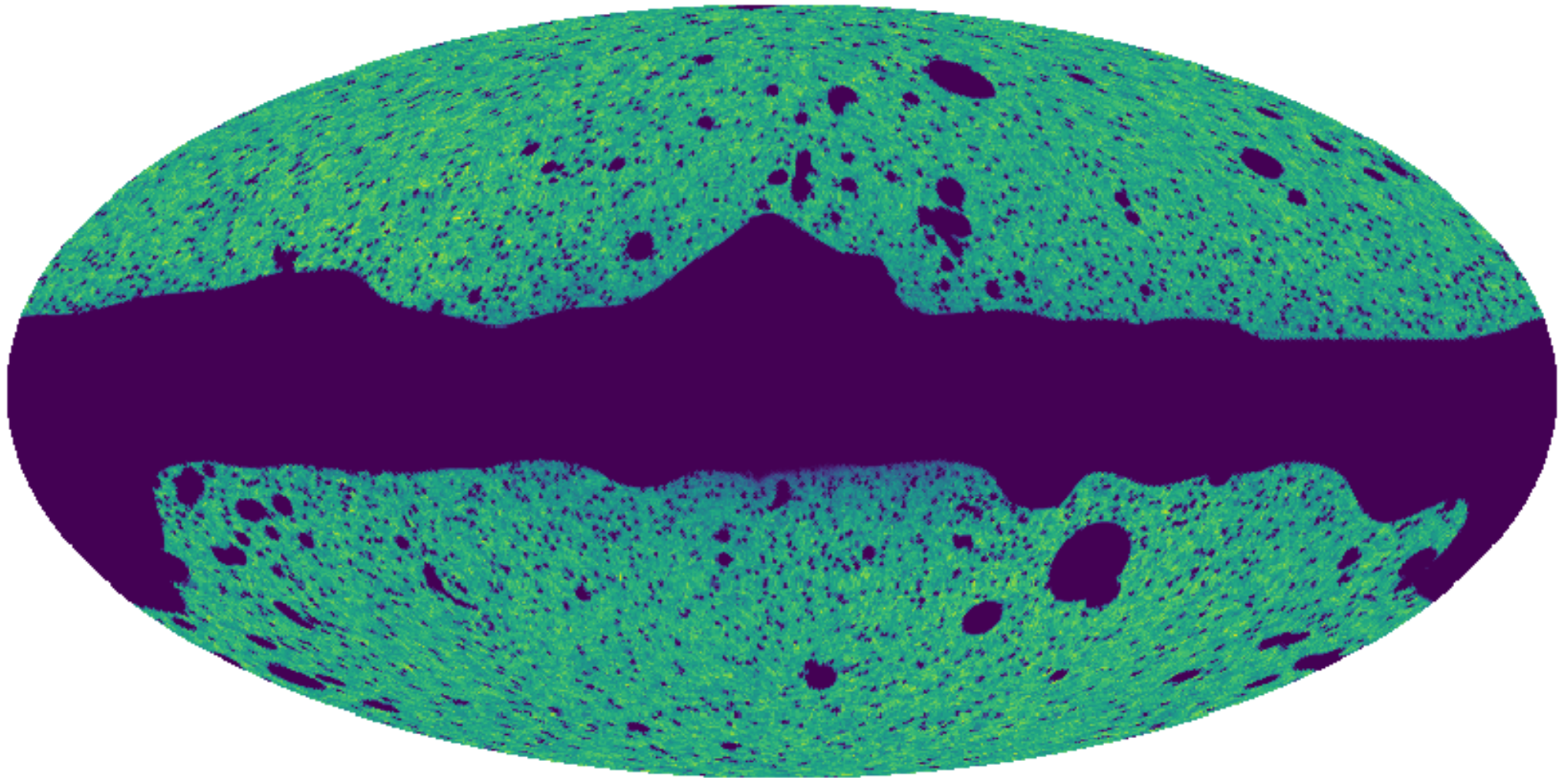
*Planck 2018, arxiv: 1807.06210*





# SKY DISTRIBUTION

Green

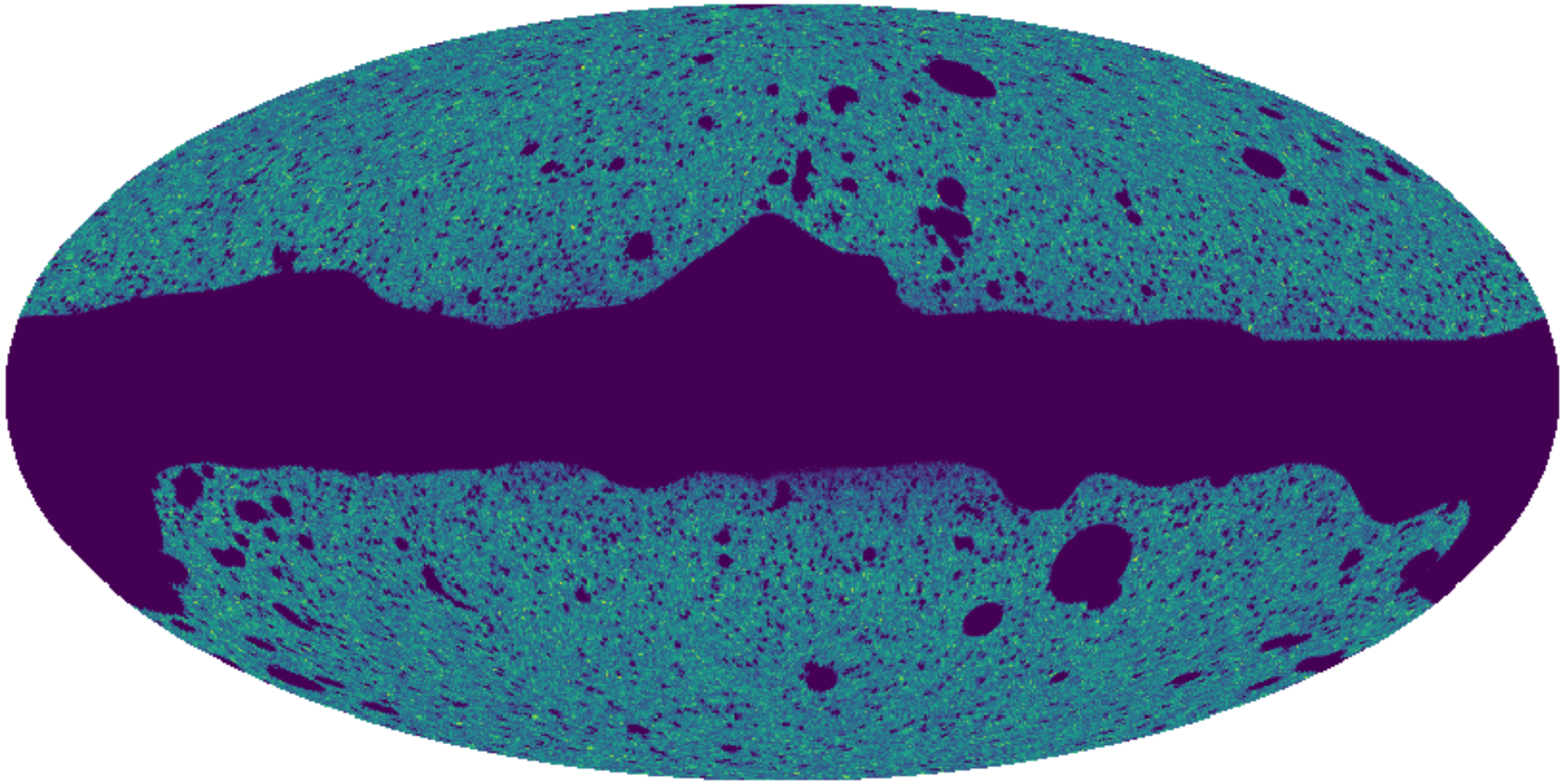




# SKY DISTRIBUTION

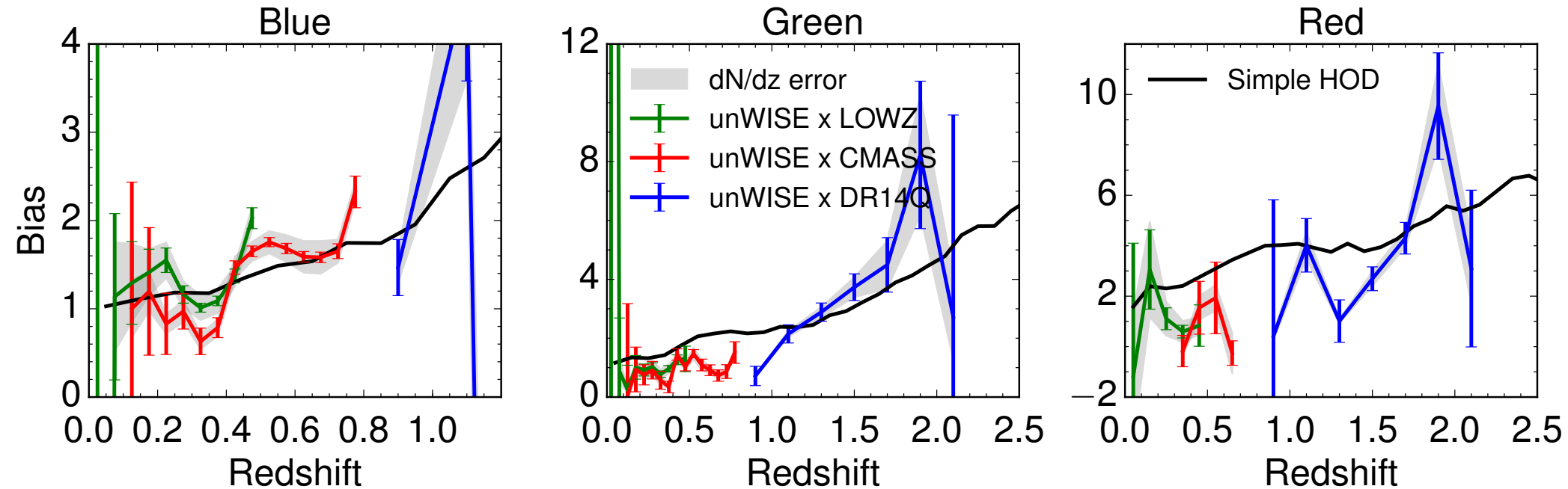
---

Red

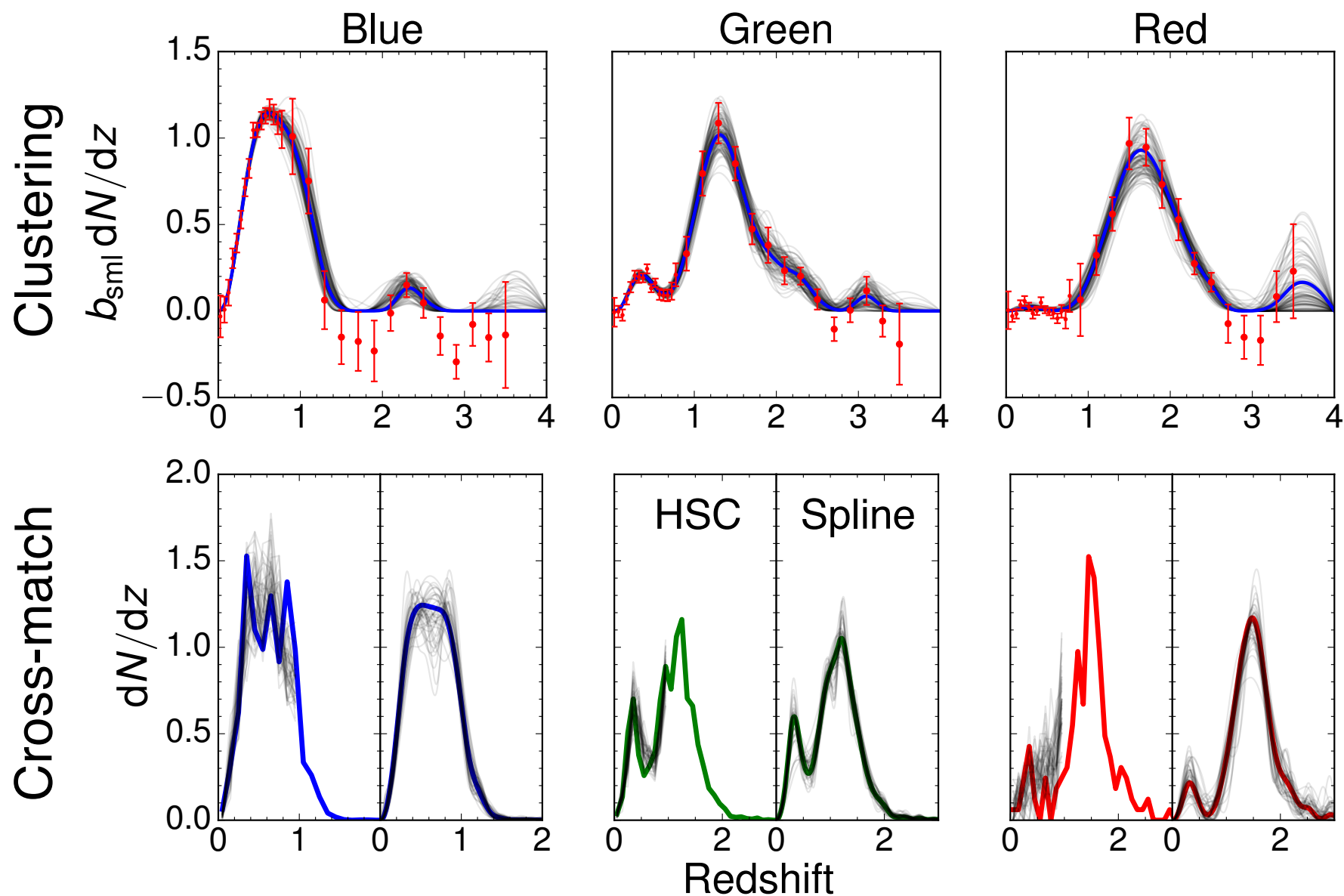


# dN/dz CONSISTENCY

- Photo-spectro clustering is roughly consistent with COSMOS dN/dz and a simple HOD for unWISE galaxies



# COMBINED $dN/dz$



# IMPACT ON POWER SPECTRA

---

## ◆ CMB lensing cross-correlation

Sample	Bias	Error from dn/dz	$\chi^2/\text{dof}$
Blue	$1.56 \pm 0.039$	0.0329	6.04/5
Green	$2.25 \pm 0.052$	0.0271	2.44/5
Red	$3.49 \pm 0.161$	0.1371	1.66/5

## ◆ Auto-correlation

Sample	Bias	Error from dn/dz	$\chi^2/\text{dof}$
Blue	$1.71 \pm 0.0072$	0.0842	16.7/4
Green	$2.46 \pm 0.0121$	0.0788	4.16/4
Red	$3.29 \pm 0.0787$	0.267	9.82/4

# CHANGING THE ECLIPTIC MASK

