



Refining Photometric Redshift Distributions with Cross-Correlations

Alexia Schulz

Institute for Advanced Study

Collaborators: Martin White

Talk Overview

* Introduction

- Weak lensing tomography can improve cosmological constraints
- Accurate source galaxy redshift distribution is essential
- Calibration with cross-correlations may be a better way to calibrate it

* Method

- The idea and how it works
- N-body simulations used to test it

* Results

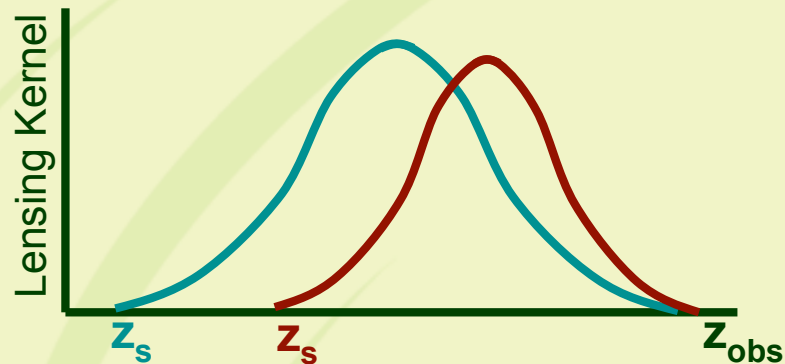
- Spectroscopic sub-sample
- Other tracers of the dark matter
- Relationship to galaxy bias

* Conclusions

- Advantages
- Outstanding theoretical questions

Why is the source galaxy distribution important for weak lensing?

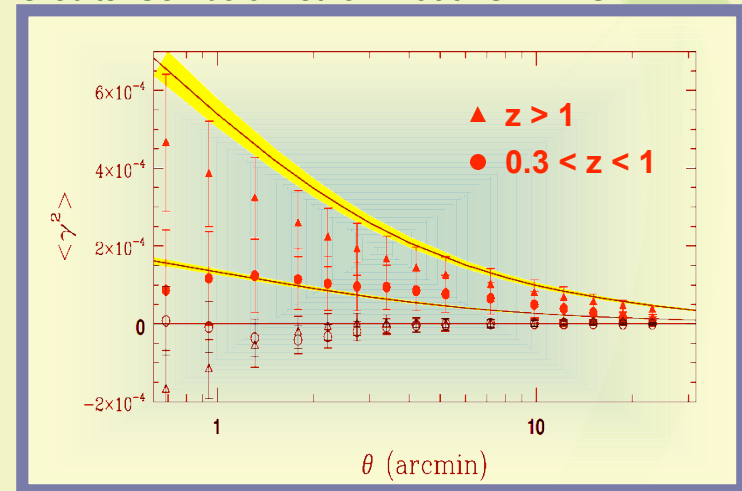
- * Sources at different redshifts are lensed differently



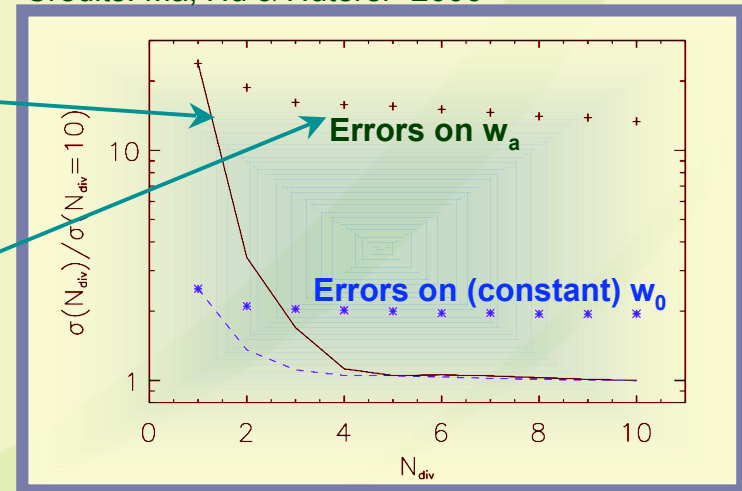
- * Using just a few source redshift bins can drastically improve constraints on parameters (solid lines)

- * Improvement is close to nothing if source distribution is unconstrained (points)

Credits: Semboloni et. al. 2006 CFHTLS

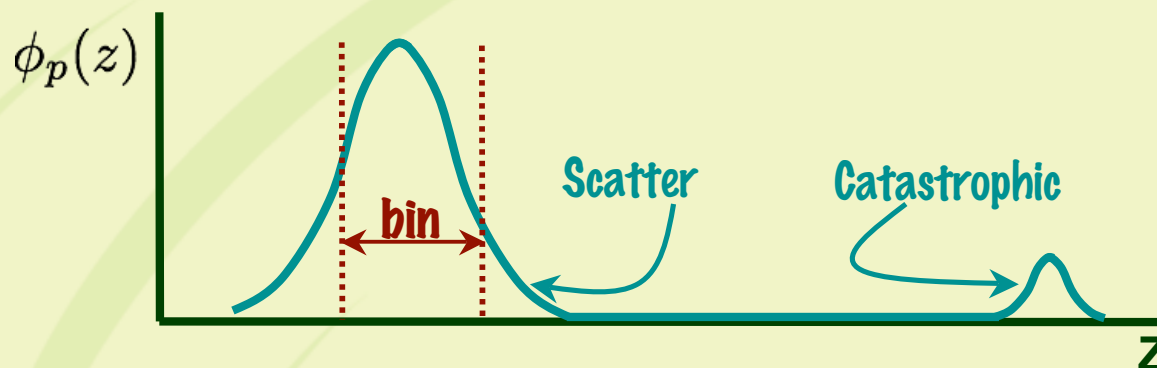


Credits: Ma, Hu & Huterer 2006



What if there are unknown errors in the photometry?

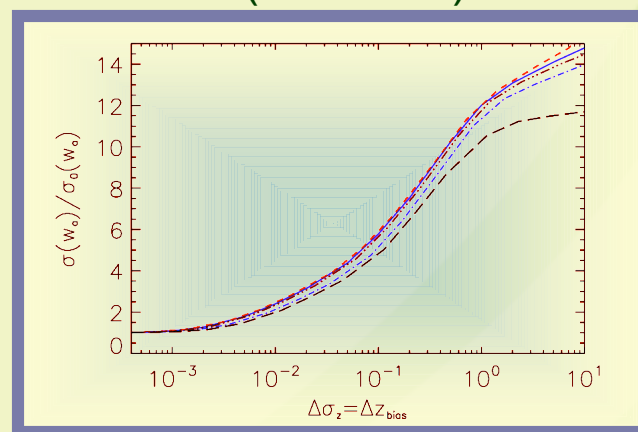
- * In a photometric bin, the true redshift distribution has some scatter, and at some redshifts catastrophic errors



- * Weak lensing tomography is very sensitive to (unknown) errors in the source galaxy distribution

Fractional increase in the constraint on w_a versus prior knowledge of scatter and offset in mean redshift

Credits: Ma, Hu & Huterer 2006



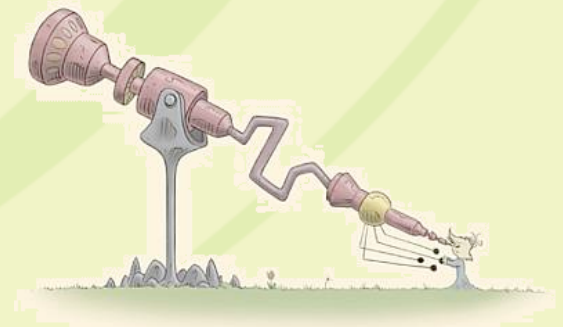
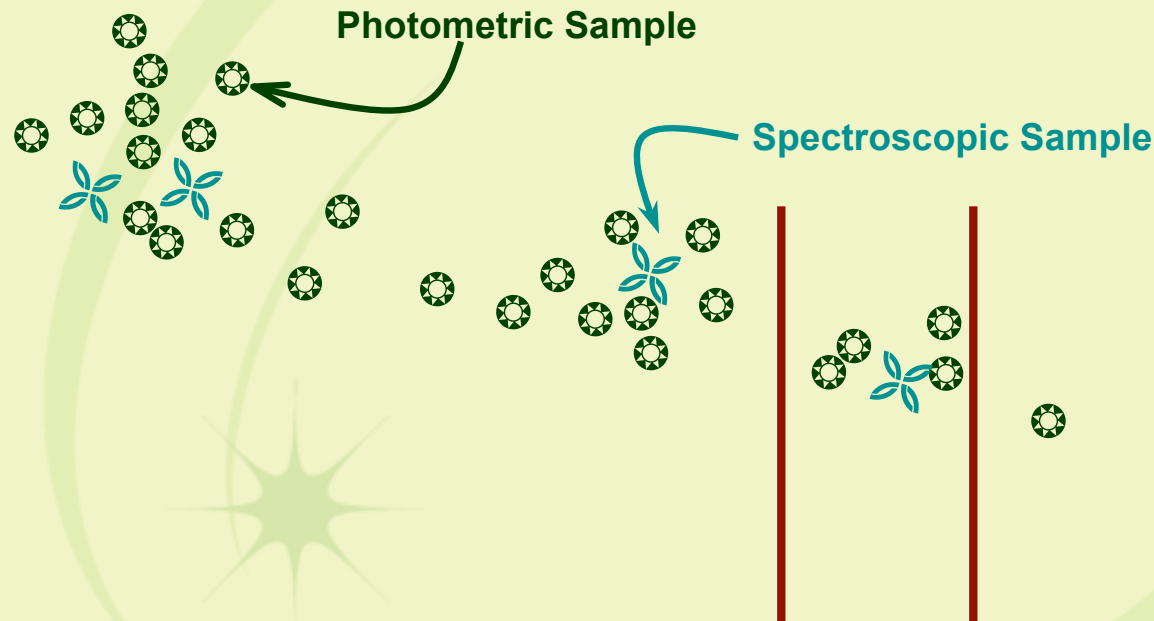
- * To use tomography effectively, the true distribution must be well understood

Why use the cross-correlation technique?

- * Large upcoming photometric galaxy surveys (DES, DUNE, Hyper SupremeCam, LSST, PanStarrs, PAU, SNAP, Vista and others) will increase the current number of survey galaxies by 2 orders of magnitude
- * Some of the surveys will be very faint, and very deep
- * Spectroscopic follow-up of a calibration sample could be very time consuming and expensive -- not very practical
- * The cross-correlation technique proposed most recently by J. Newman (<http://astron.berkeley.edu/%7Ejnewman/xcorr/xcorr.pdf>) may not require such extensive spectroscopic follow up observations
 - Any other tracer (LRGs, quasars, etc.) as calibrating sample
 - May be able to use legacy data (SDSS)
 - Requirement: spatially overlapping

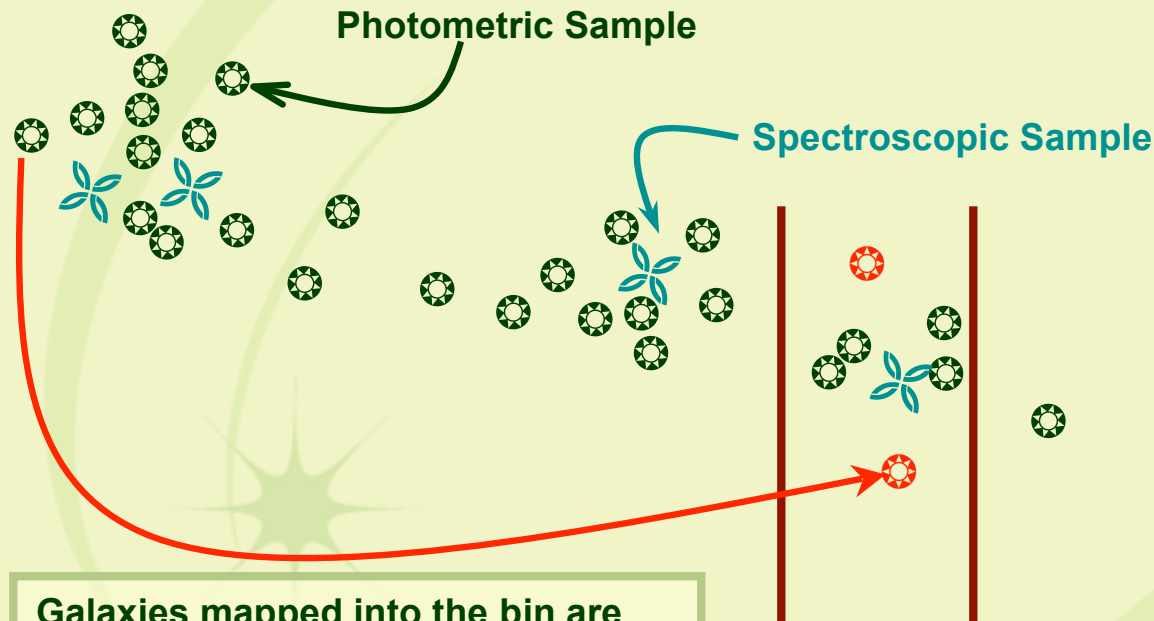
How does it work? (Picture people)

- * Objects in the photometric and spectroscopic samples trace the same underlying dark matter structures
- * Positions of photometric objects will be correlated with those of spectroscopic objects at the same redshift (physically close)

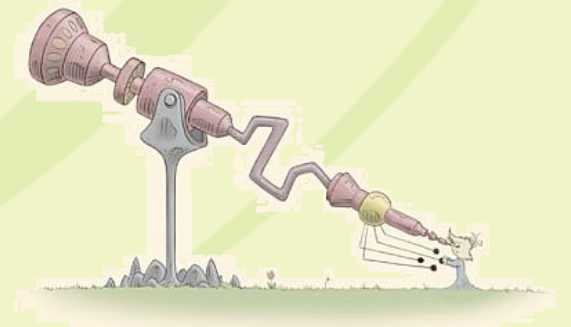


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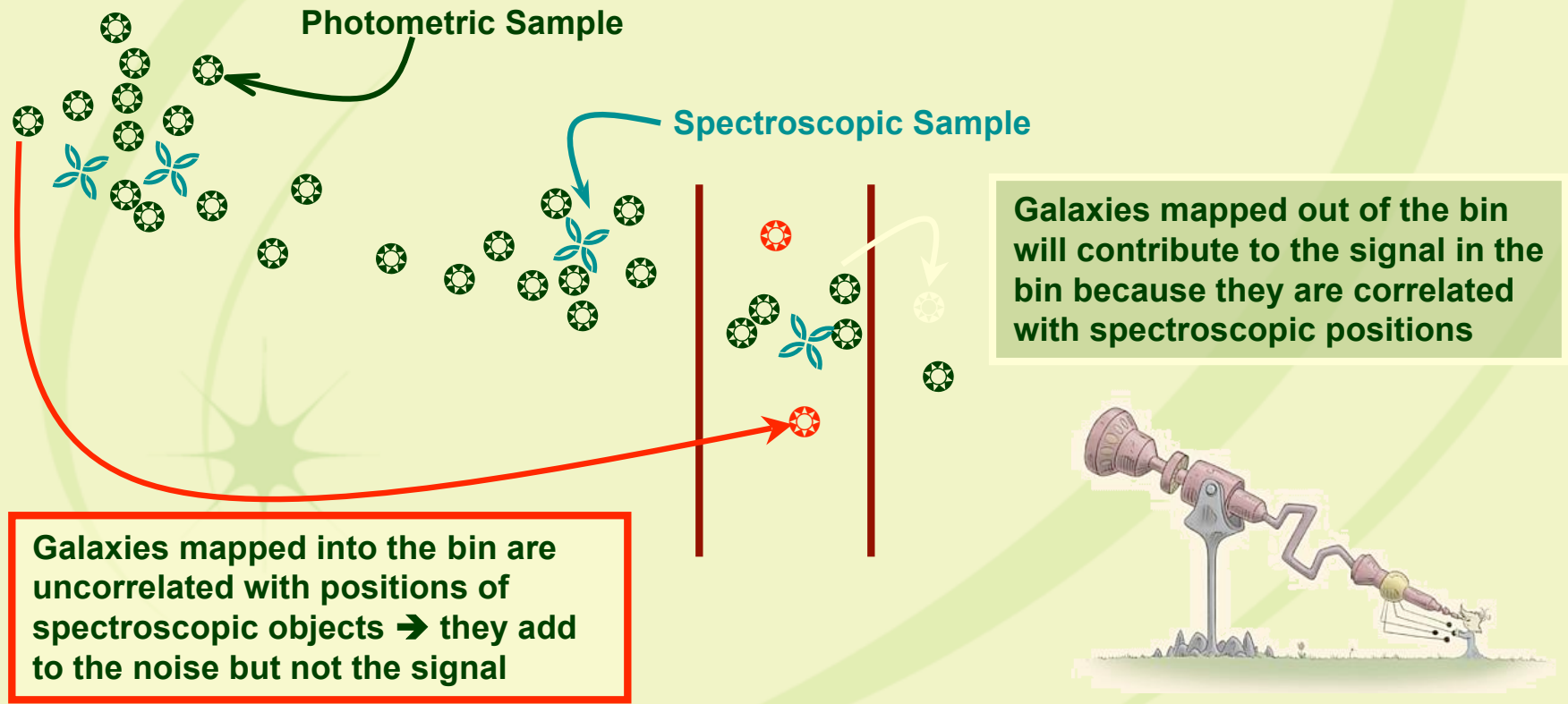


Galaxies mapped into the bin are uncorrelated with positions of spectroscopic objects → they add to the noise but not the signal



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How does it work? (Equation people)

- * The fundamental assumption relates the 3D cross-correlation function to the observable 3D autocorrelation function of the spectroscopic sample

2D Angular cross-correlation

3D cross-correlation function

Photometric selection function

$$\omega_{ps}(\theta, z_s) = \int dz \xi_{ps}(z, z_s, \theta) \phi_p(z)$$

At large (linear) scales assume: $\xi_{ps}(z, z_s, \theta) \propto \xi_{ss}(z, z_s, \theta)$

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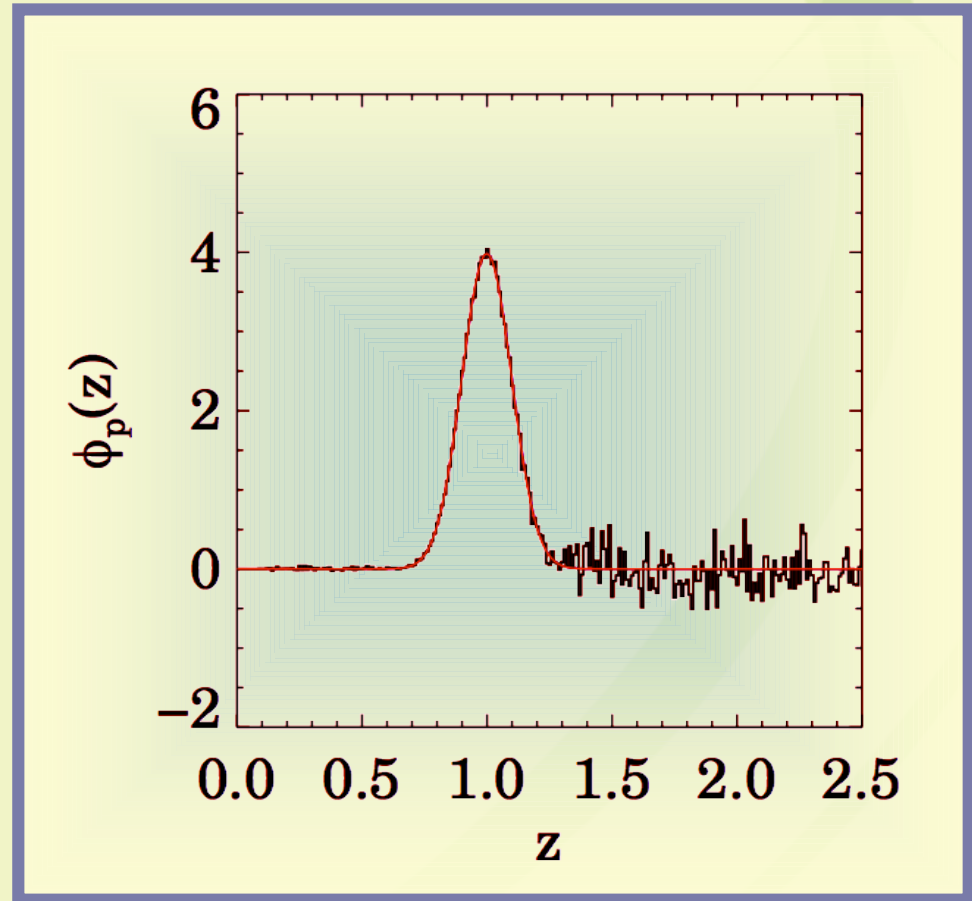
Observables

Invert integral to solve
for the selection function

Tests with MCMC

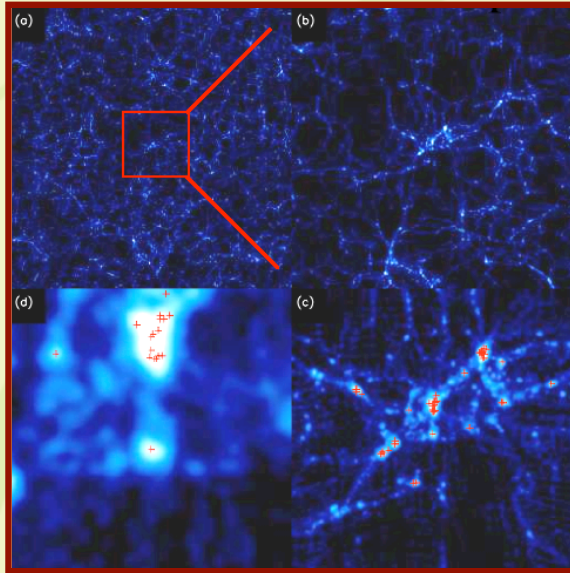
- * 10,000 Monte Carlo realizations of the photometric distribution have been used to test the reconstruction technique.
- * Each realization split into redshift bins
- * Error has been added to the true $\phi_p(z)$ for each bin
- * The technique seems promising

<http://astron.berkeley.edu/%7Ejnewman/xcorr/xcorr.pdf>



Test with N-body simulations

- * Perform cosmological dark matter simulations



Volume: 1 (Gpc/h)^3

Dark matter halos: 7.5 Million

Halo masses: $M > 5 \times 10^{11} M_{\odot}/h$

Central galaxy at gravitational potential minimum

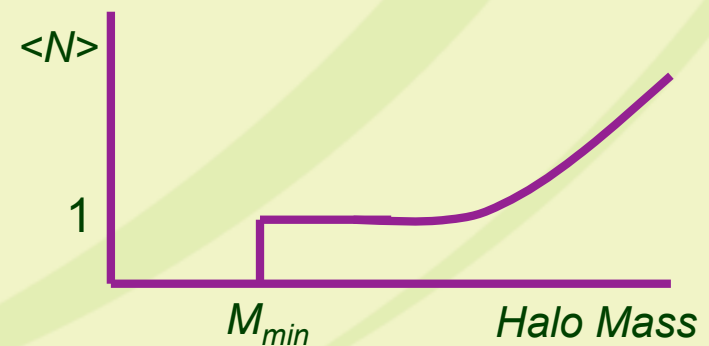
Satellite galaxies trace dark matter

Satellite galaxies Poisson distributed about $\langle N_s \rangle$

- * Use halo model to populate with “galaxy” populations of differing biases

One parameter family for $\langle \mathcal{N}_{gal} \rangle$

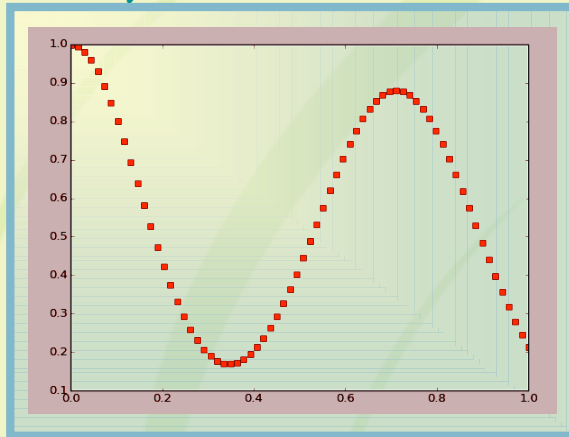
$$\langle N_{gal}(M) \rangle = \Theta(M - M_{min}) \left(1 + \frac{M - M_{min}}{10 M_{min}} \right)$$



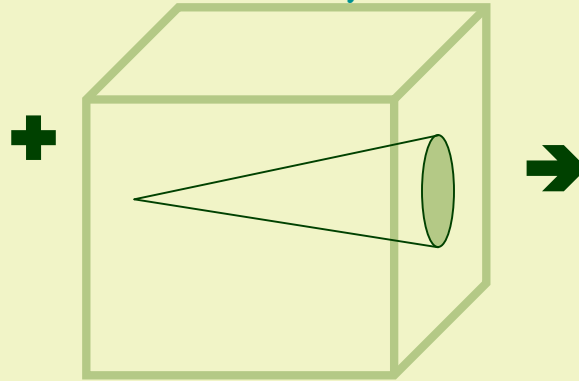
Test with N-body simulations

- ✱ Impose a selection function and survey geometry on the mock photometric sample to be calibrated (these lead to a $\phi_p(z)$)

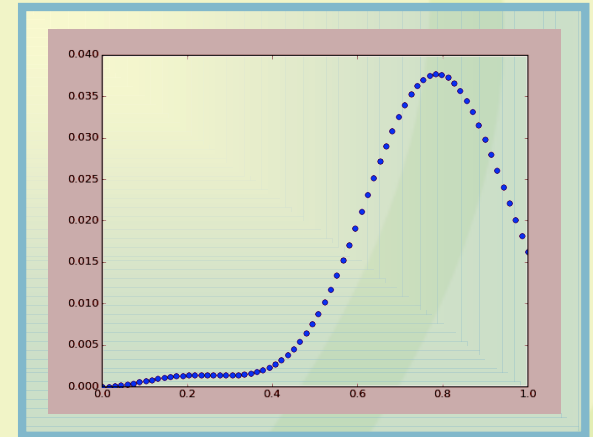
Wacky selection function



Geometry



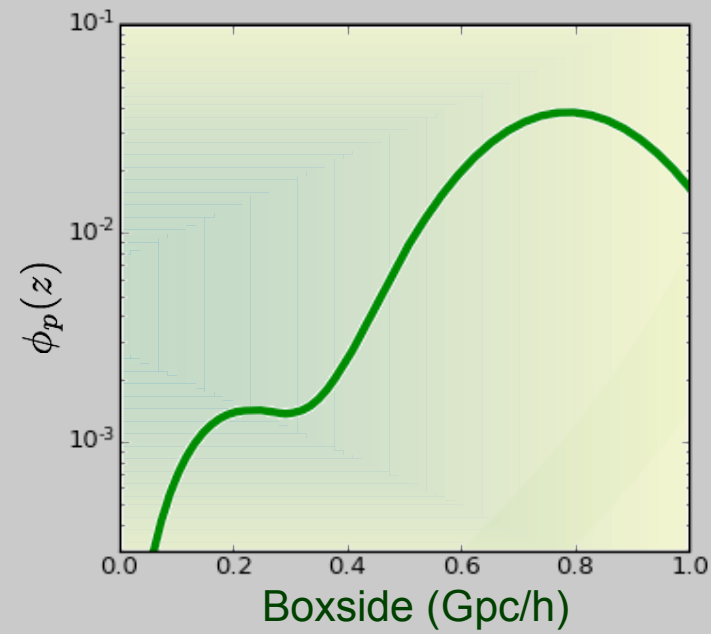
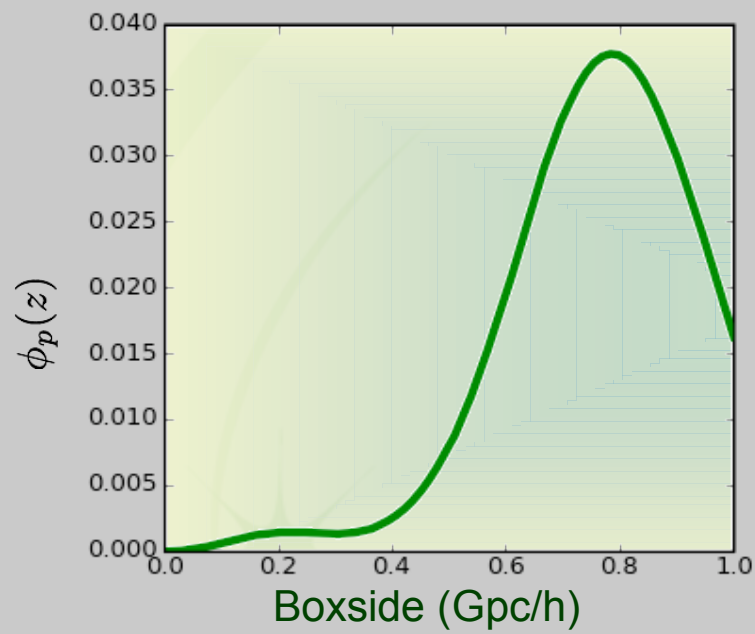
Photometric distribution



- ✱ Compute $\omega_{ps}(\theta, z_s)$ and $\xi_{ss}(\theta, z, z_s)$, and invert the relation to obtain the reconstructed photometric distribution $\phi_p(z)$
- ✱ Compare to the input photometric redshift distribution
- ✱ Test 1: A fair sub-sample of the photometric galaxies ($\xi_{ss} = \xi_{ps}$)
- ✱ Test 2: A completely unrelated class of tracer with a different bias
- ✱ Test 3: Tests 1 and 2 in a light cone with evolving ξ_{ss} and ξ_{ps}

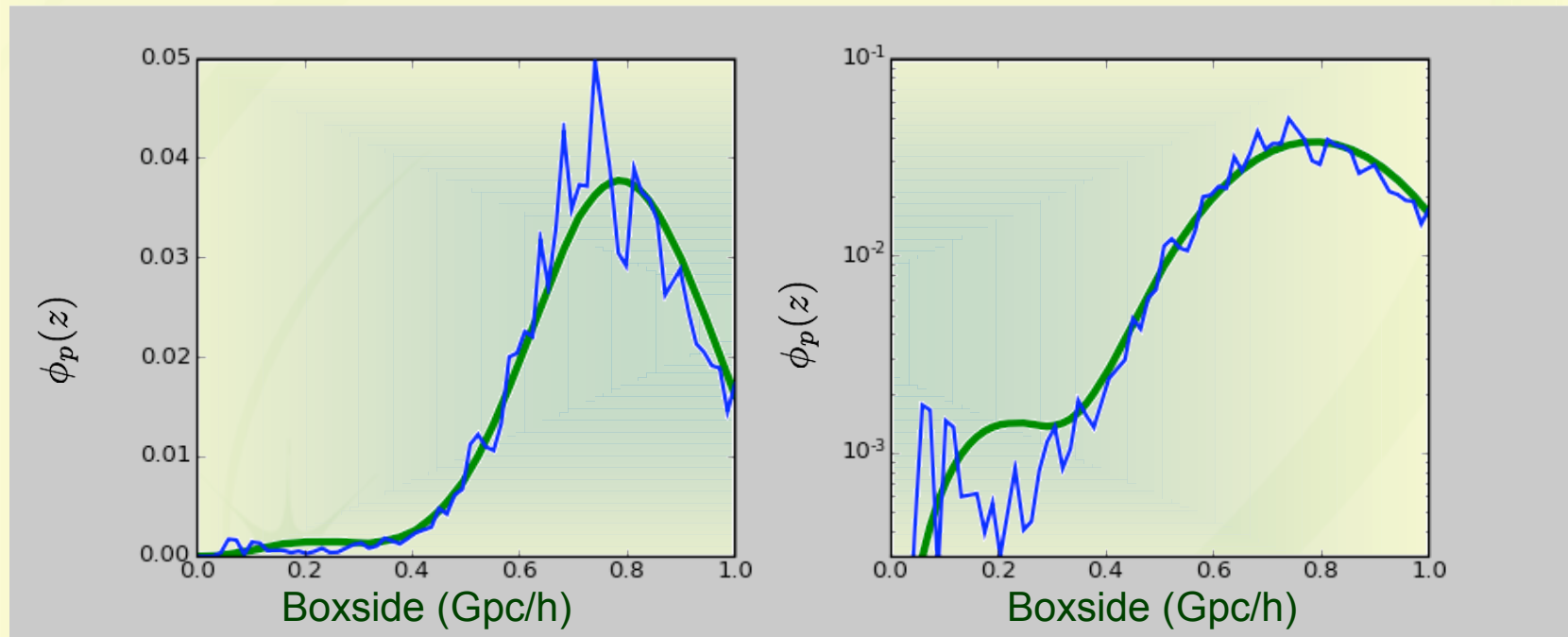
Test 1: Spectroscopic sub-sample

Input redshift distribution



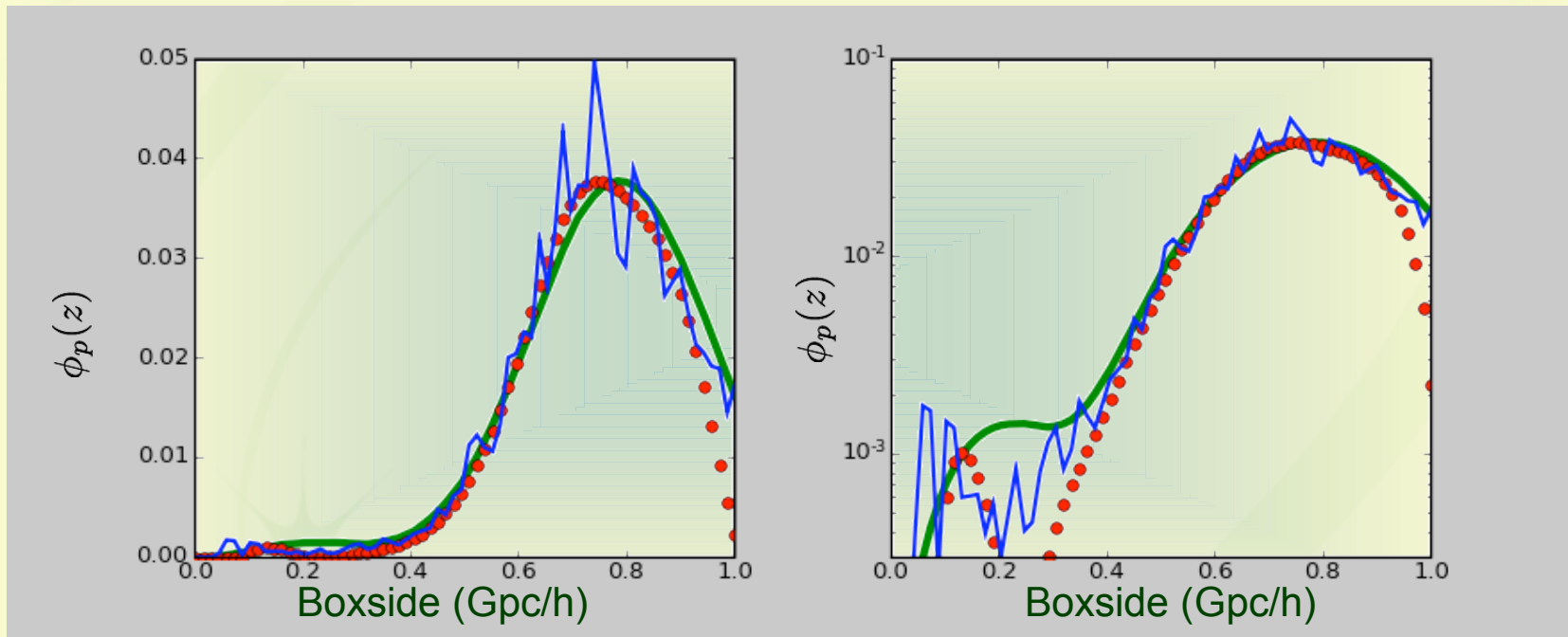
Test 1: Spectroscopic sub-sample

One realization of galaxies in halos ($M_{\min}=5e11 M_{\odot}/h$)



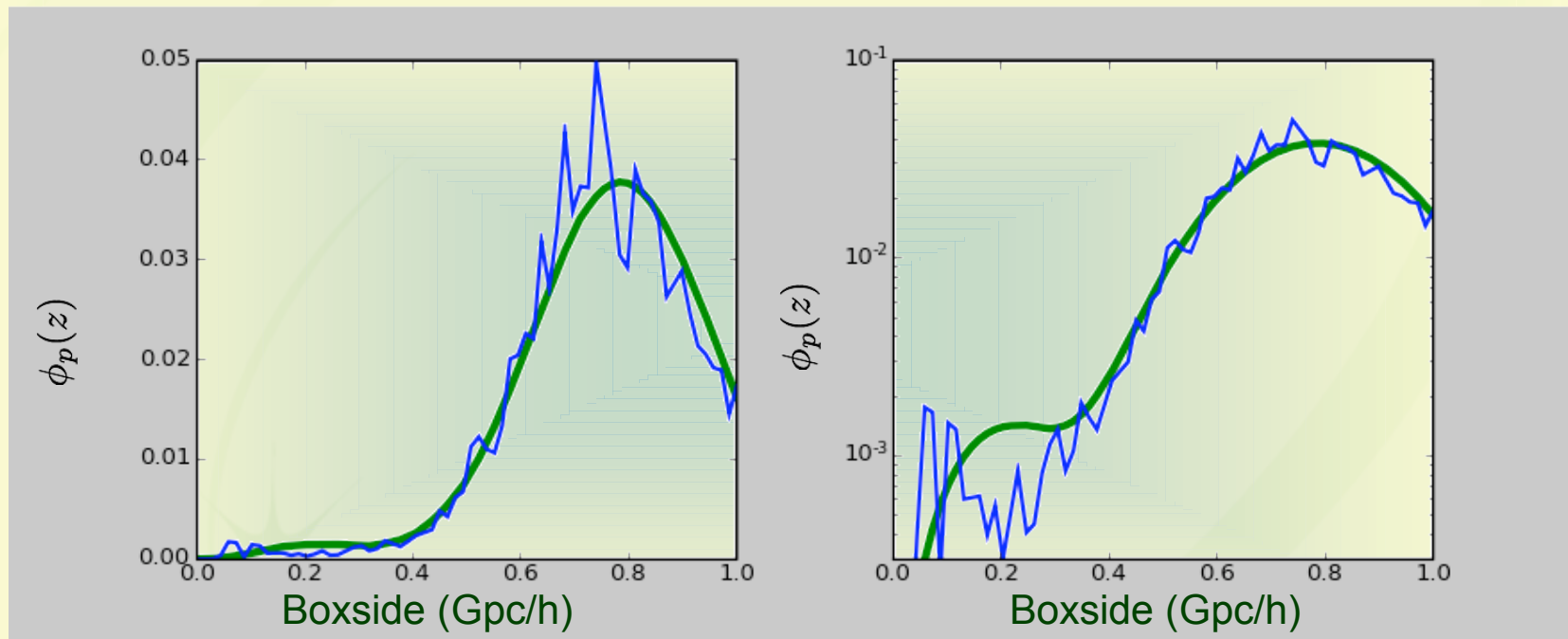
Test 1: Spectroscopic sub-sample

Our reconstruction using 1/10 randomly selected subsample



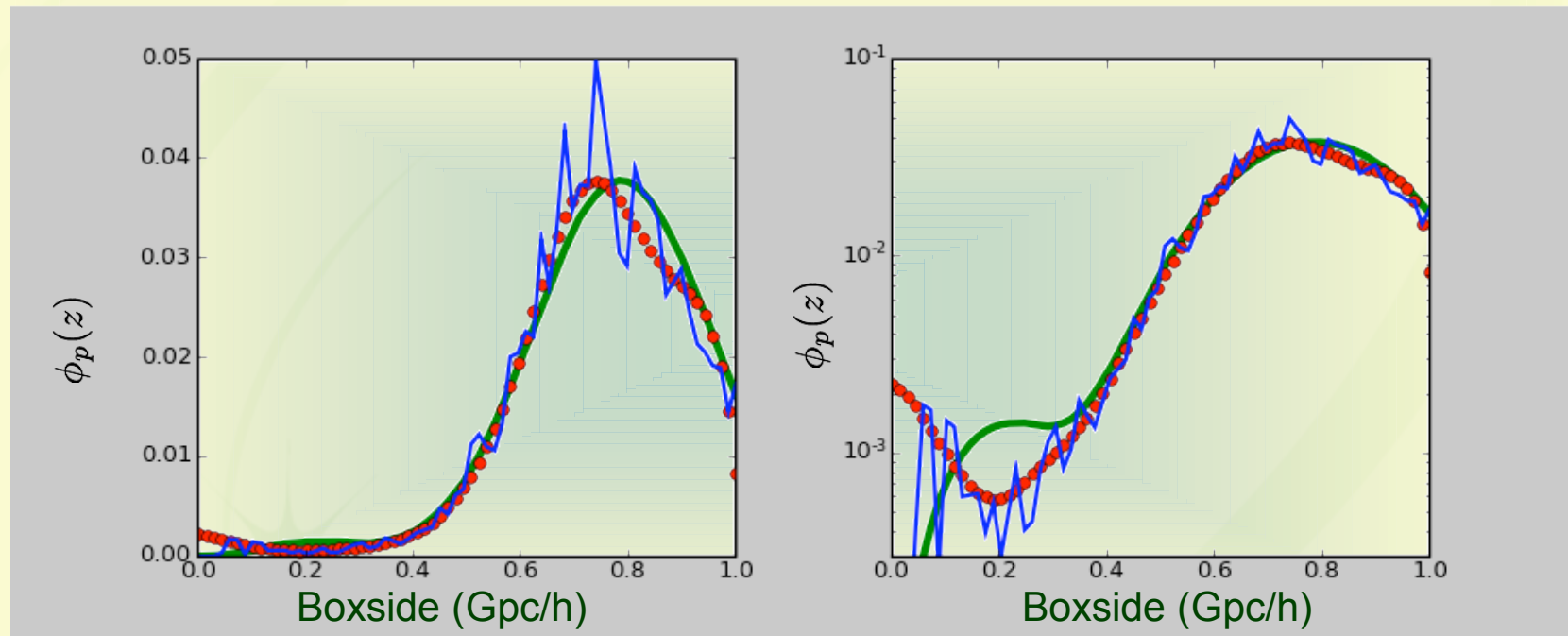
Test 2: Other tracers as calibrators

Same setup



Test 2: Other tracers as calibrators

Reconstruction using more biased tracers ($M_{\min}=7e12 M_{\odot}/h$)



Test 3: Light cones with evolving biases

- * DNE (yet!)
- * It's crucial to investigate light cone evolution due to a potential degeneracy between $\phi_p(z)$ and $b_p(z)$

$$\xi_{ps}(r, z) = \frac{b_p(z)}{b_s(z)} \xi_{ss}(r, z) \quad \rightarrow \quad (b_p(z)\phi_p(z)) \quad \text{In terms of observables}$$

- * $\omega_{pp}(\theta)$ does not break this degeneracy:

$$\xi_{pp}(r, z) = \left(\frac{b_p(z)}{b_s(z)} \right)^2 \xi_{ss}(r, z)$$

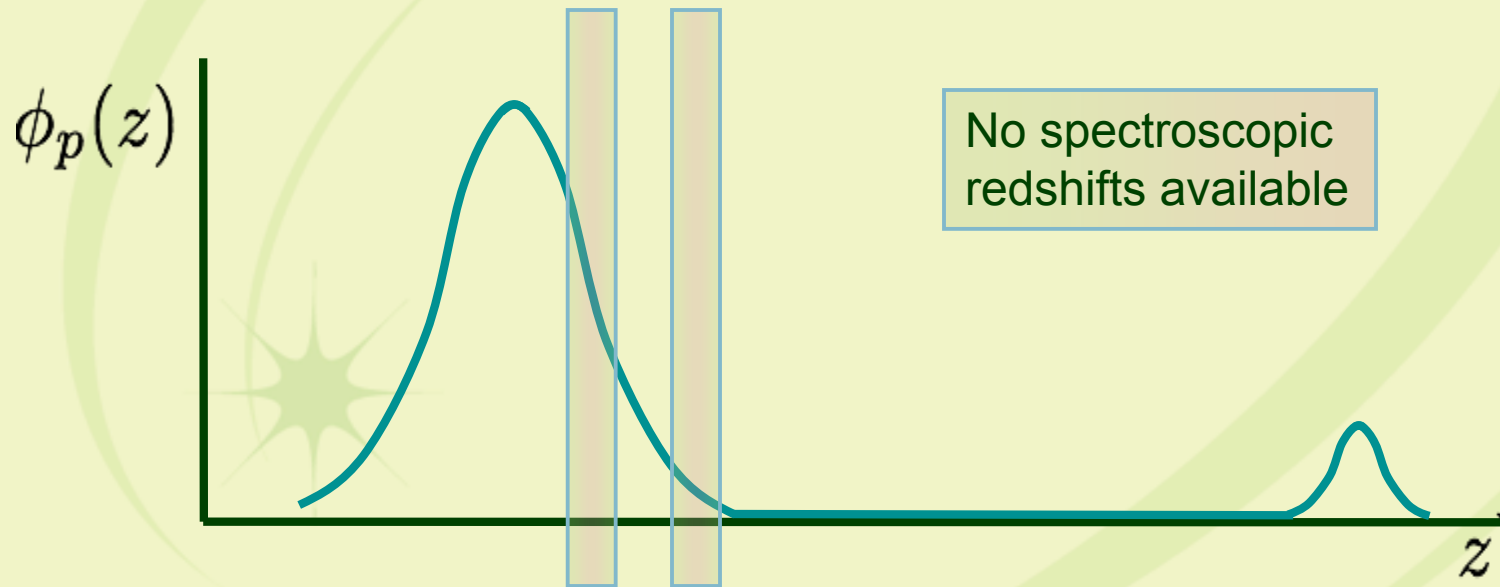
$$\omega_{pp} = \int dz_1 \int dz_2 \phi_p(z_1) \phi_p(z_2) \xi_{pp}(\theta, z_1, z_2)$$

$$\rightarrow (b_p(z)\phi_p(z))^2 \quad \text{In terms of observables}$$

- * Could be difficult to put a reasonable prior on $b_p(z)$
- * Fair sub-sample will avoid this problem (but is inconvenient)

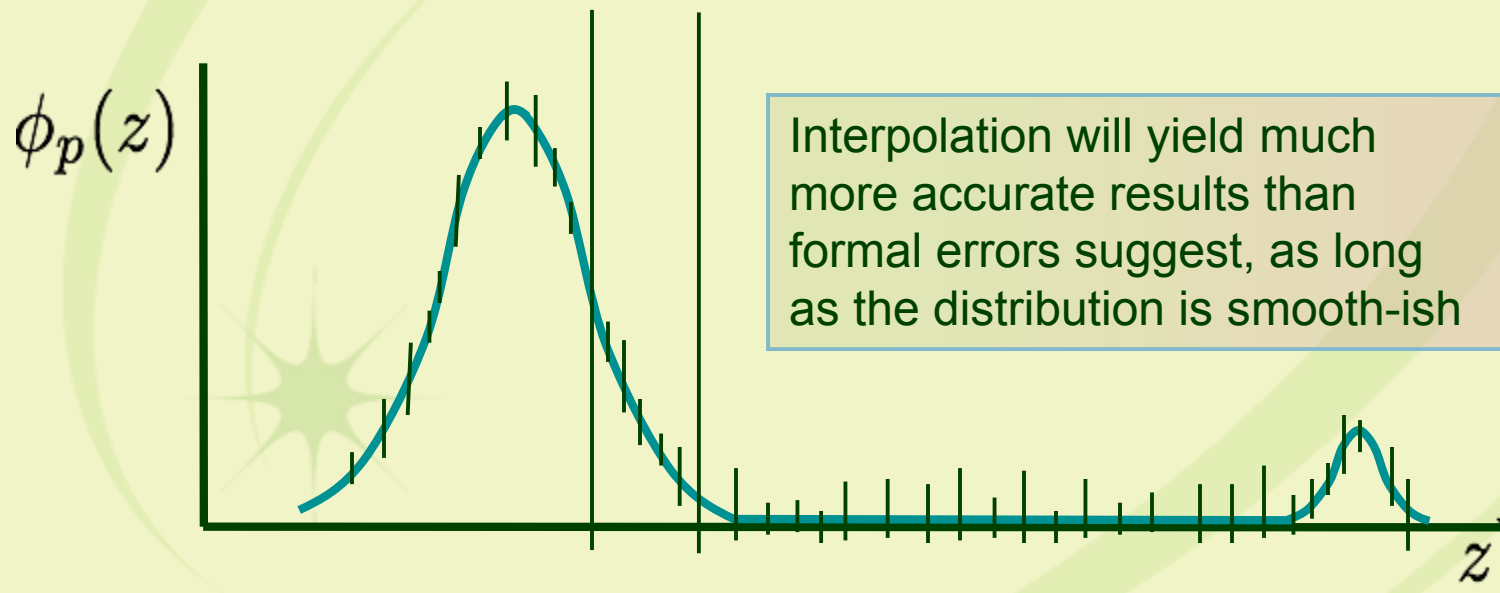
Cross-correlations may have some advantages over direct calibration

- * If a fair sub-sample is needed, one might still use the cross-correlation method to help calibrate the photometry
- * Contains some independent information: improve calibration
- * Insensitive to catastrophic errors in photometry
- * Not adversely affected by spectroscopic redshift deserts



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Conclusions

- * Weak lensing constraints on cosmological parameters are highly improved by splitting source galaxies into redshift bins
- * Tomographic lensing measurements are quite sensitive to uncertainties in source galaxy redshift distribution
- * Upcoming surveys will yield an unprecedented volume of photometric data, making spectroscopic follow-up inconvenient
- * Cross-correlations are a promising method for calibrating galaxy redshift distributions
- * Potential degeneracy between the redshift distribution and evolution of the bias of the photometric sample may compel sub-sample follow-ups
- * The cross-correlation method may have some advantages over conventional direct calibration methods, even with spectroscopic follow up observations