

# Inferring redshift distributions from clustering measurements

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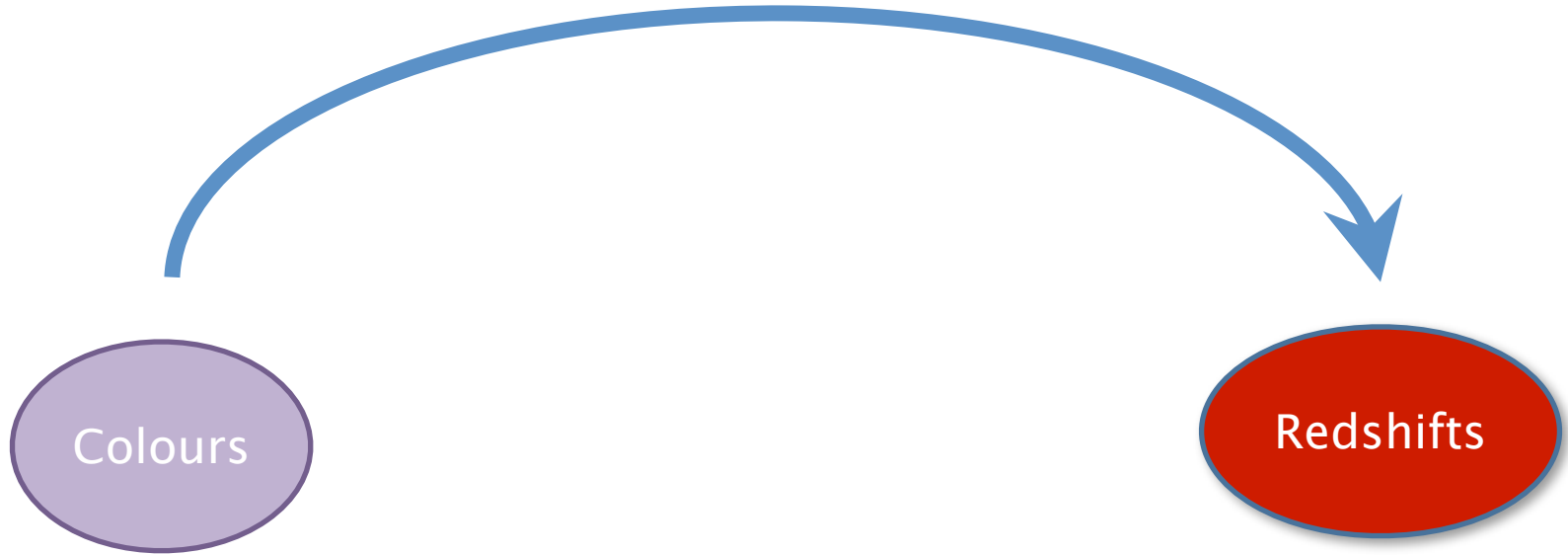
# spectroscopic redshifts

- They are well defined as long as spectral features are present and unambiguously identified
- The source needs to be bright enough
- They are expensive

As time goes on the fraction of *known* galaxies for which we have a spectroscopic redshift **decreases**.

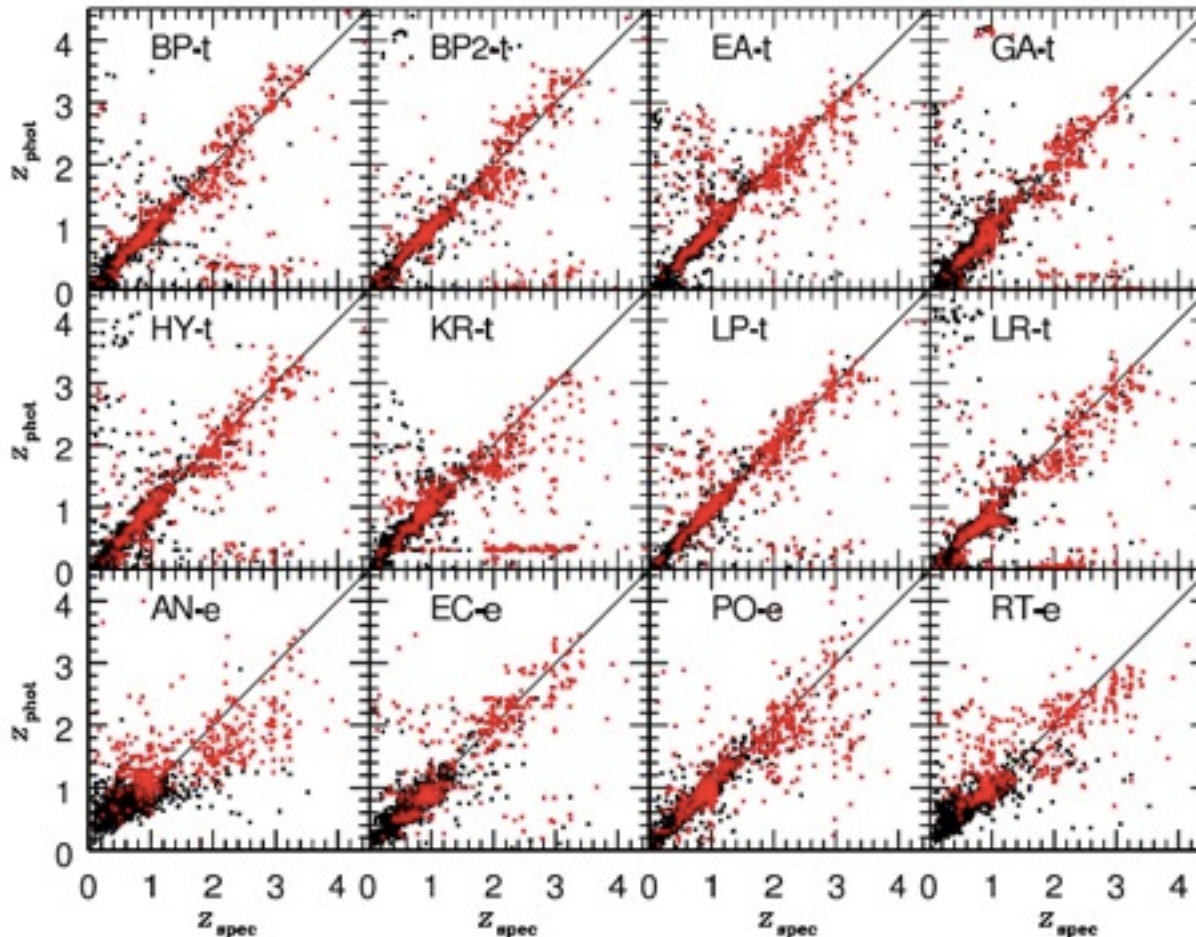
# Photometric Redshifts

SEDs or Training Sets



# Photometric redshifts

- They rely on templates (theoretical or observed)
- They require training sets. The answer is not unique.

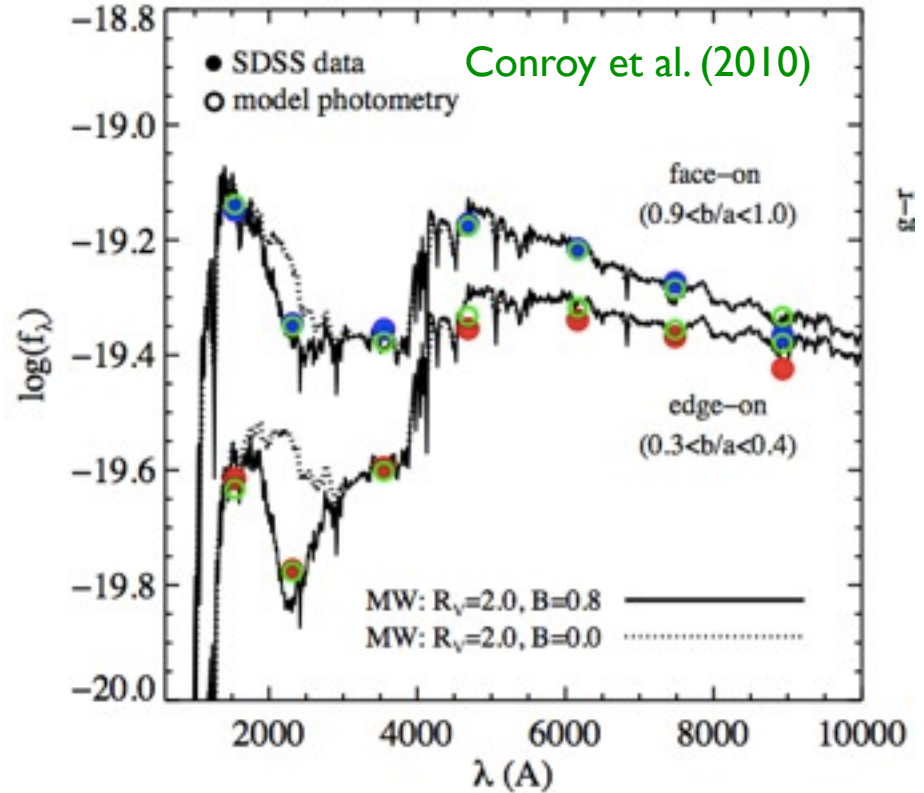
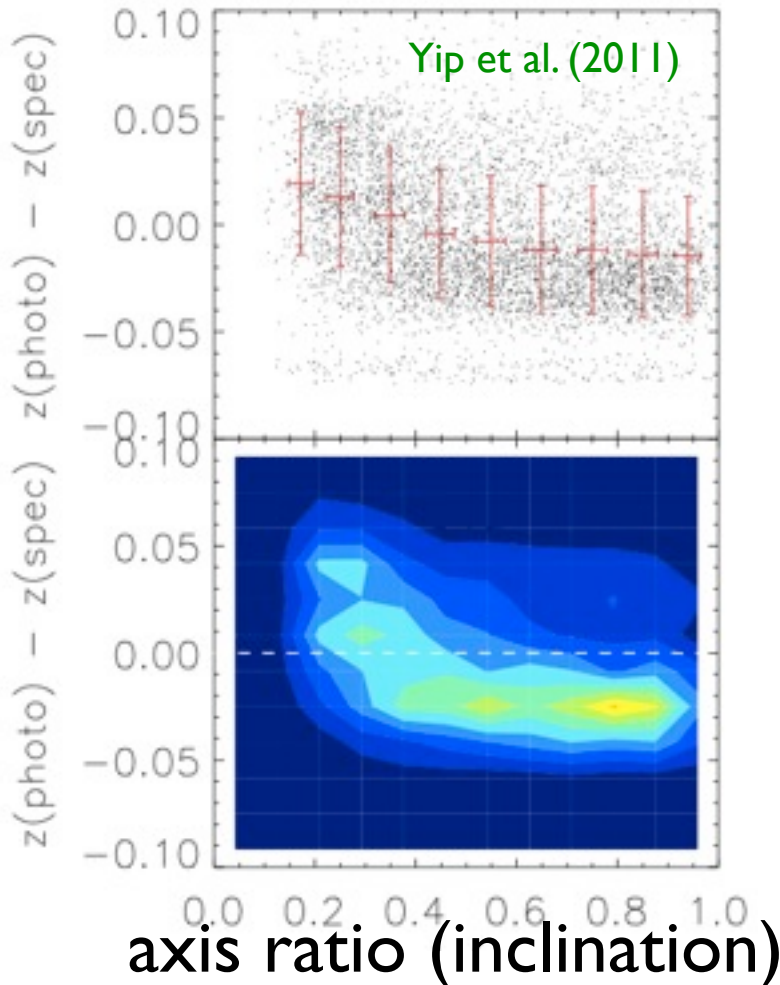


**PHAT: PHoto- $z$  Accuracy Testing** ★

Hildebrandt et al.

# Photometric redshifts

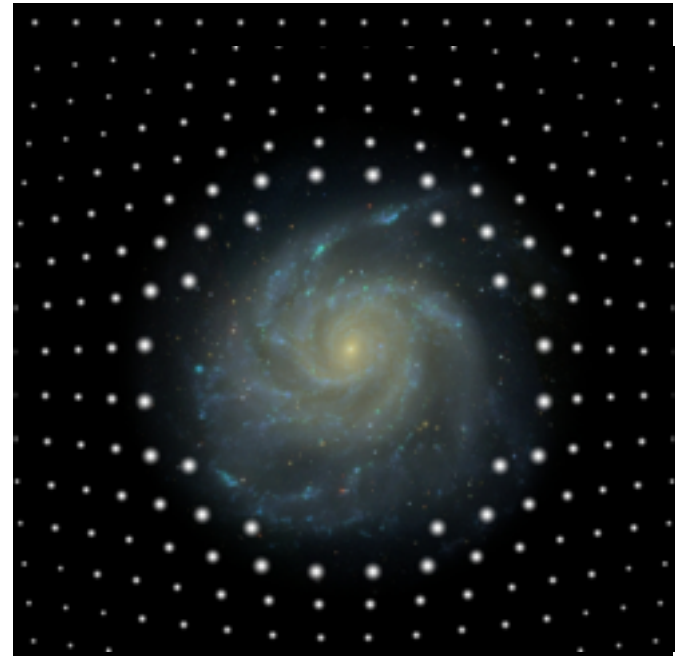
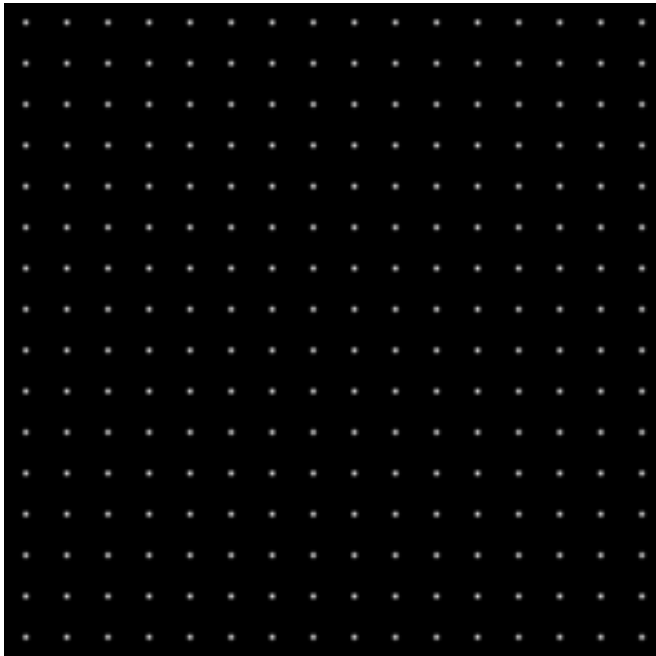
- They rely on templates (theoretical or observed)
- They require training sets. The answer is not unique.
- They are affected by dust extinction/reddening effects



# Photometric redshifts

- They rely on templates (theoretical or observed)
- They require training sets. The answer is not unique.
- They are affected by dust extinction/reddening effects
- They suffer from catastrophic failures

=> serious problem to select clean samples of foreground & background objects, needed for gravitational lensing.

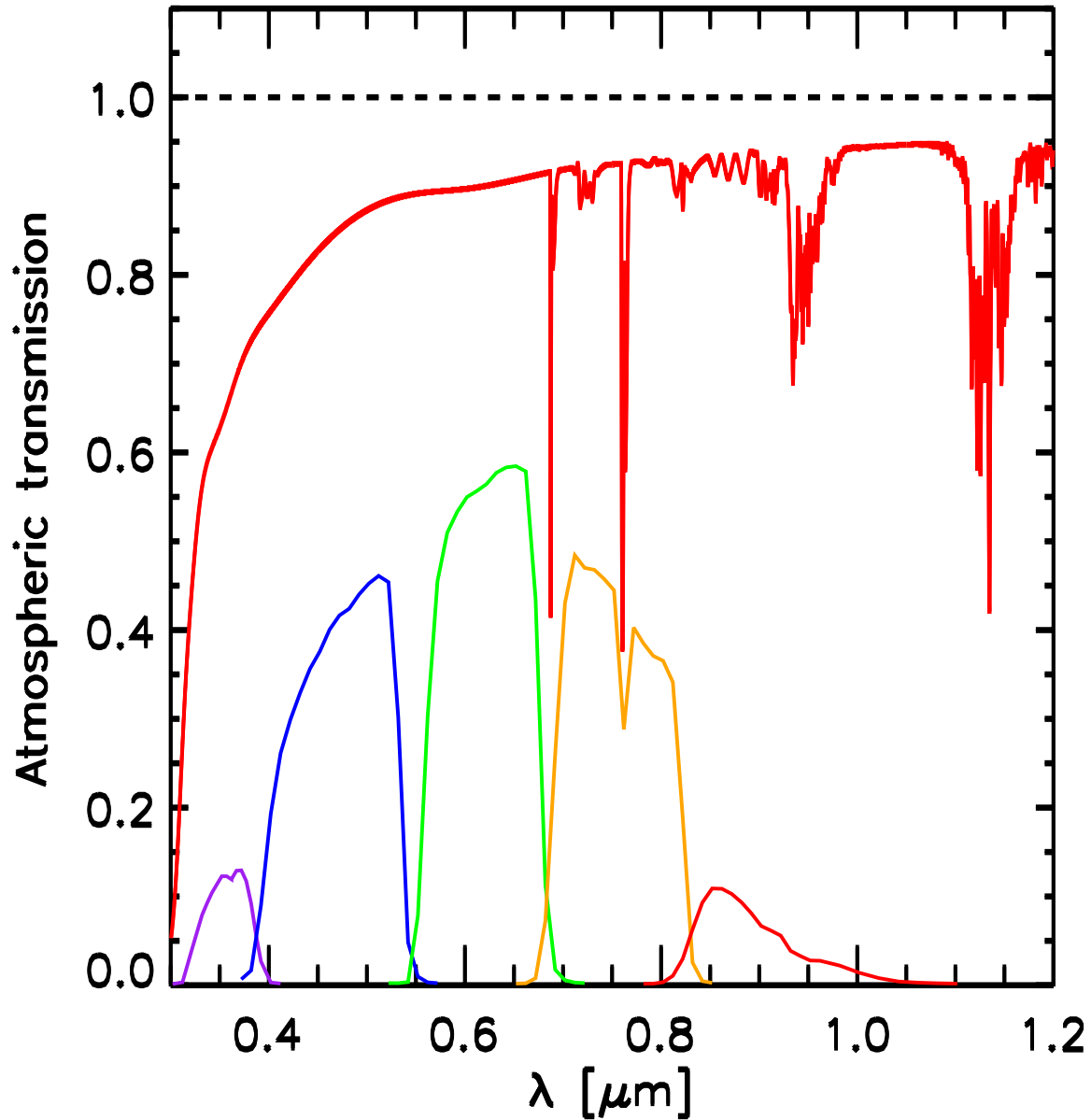


# Photometric redshifts

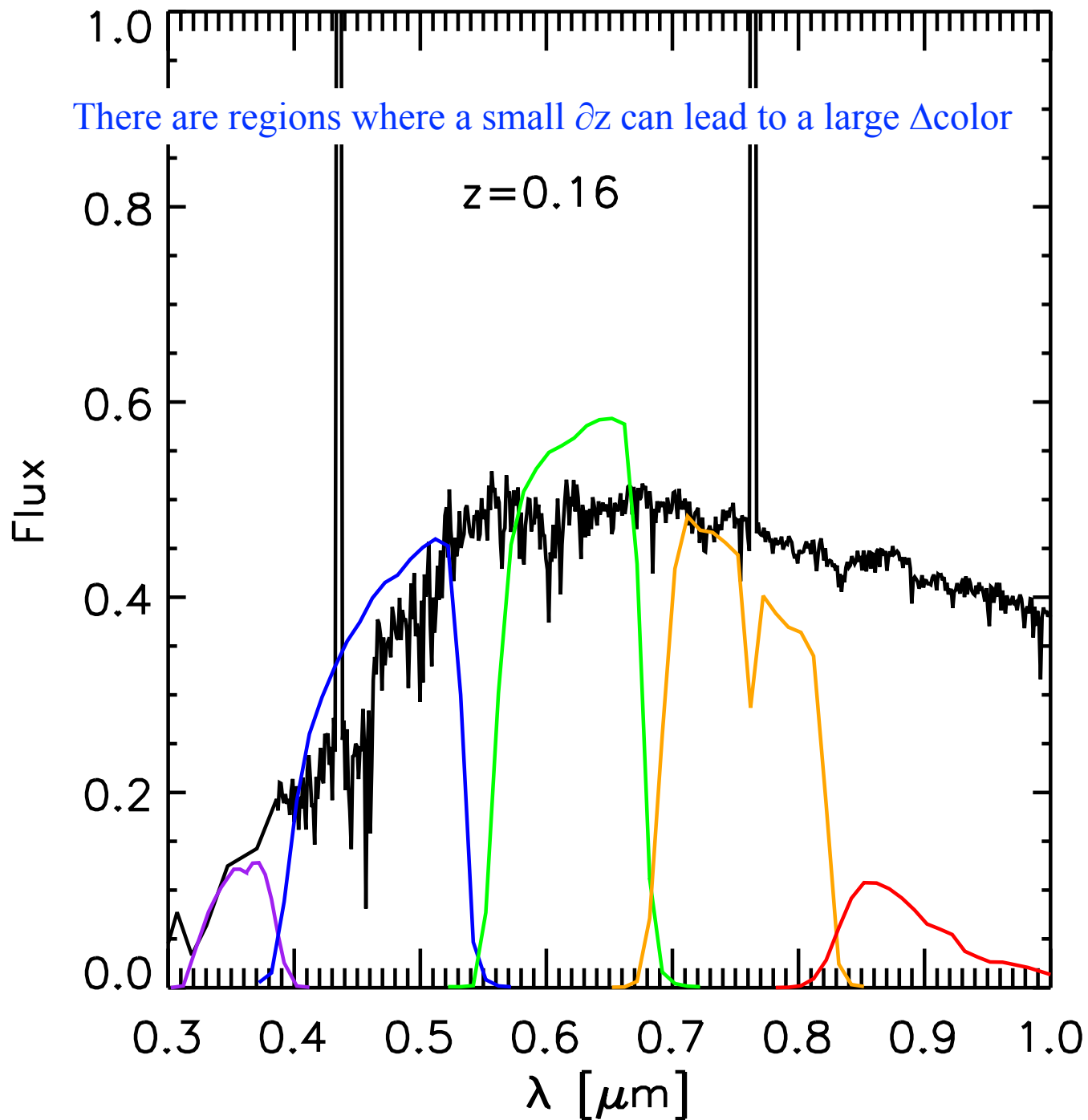
- They rely on templates (theoretical or observed)
  - They require training sets. The answer is not unique.
  - They are affected by dust extinction/reddening effects
  - They suffer from catastrophic failures
- 
- Most importantly they rely on our a priori knowledge of the sources. When exploring the unknown, they may no longer be reliable.

We could completely miss an entire population of galaxies.

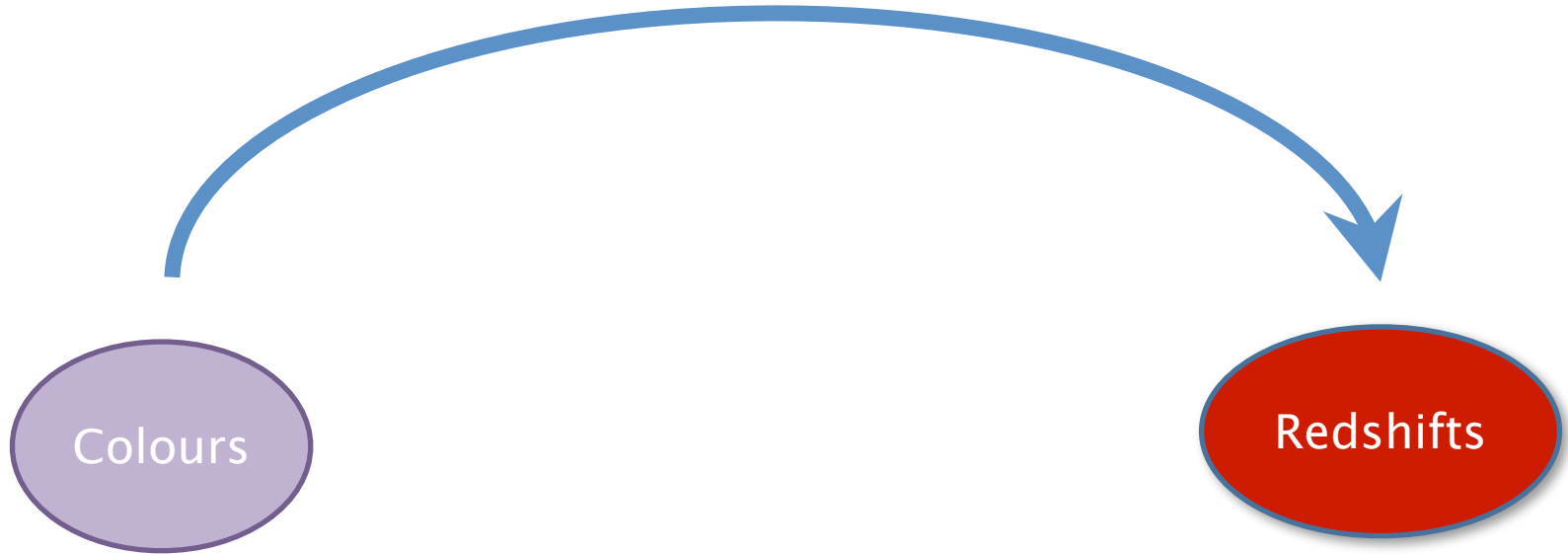
# Atmospheric transmission







**Photometric Redshifts**  
SEDs or Training Sets



$$\langle \delta_1 \delta_2 \rangle \sim b_1 b_2 \frac{dN_1}{dz} \frac{dN_2}{dz}$$

**Clustering Redshifts**  
Spatial Correlation with Reference Set

# Estimating redshifts

$$\langle \delta_1 \delta_2 \rangle \sim b_1 b_2 \frac{dN_1}{dz} \frac{dN_2}{dz}$$

Seldner & Peebles (1979), Roberts & Odell (1979)

Landy, Szalay, Koo (1996) \_\_\_\_\_ [local sampling]

Newman (2008), Matthews & Newman (2010, 2012)

Schultz (2010), McQuinn & White (2013), de Putter et al. (2013)

**Schmidt et al. (2012), Ménard et al. (2013), \_\_\_\_\_ [local sampling]**

**Rahman et al. (2013)**

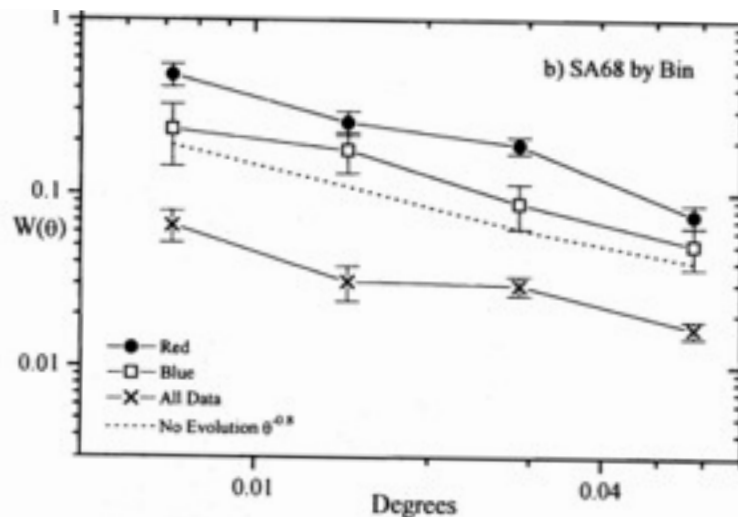
# STRONG ANGULAR CLUSTERING OF VERY BLUE GALAXIES: EVIDENCE OF A LOW-REDSHIFT POPULATION

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## ABSTRACT

We have studied galaxy two-point angular correlations as a function of color using 4 m plate photometry in two independent fields. Each field consists of over 2900 galaxies with magnitudes  $20 < B_j < 23.5$  in an area of  $\sim 750$  arcmin<sup>2</sup>. We find that the autocorrelation amplitude of the bluest 15% of galaxies is surprisingly strong, with a relative increase in clustering amplitude of a factor of 6 over that of the complete data set, while exhibiting a power-law slope consistent with the canonical value of  $-0.8$ . These very blue galaxies are also found to be weakly correlated with galaxies of median color and marginally anticorrelated with the reddest subset. These correlation properties are incompatible with existing simple models of the galaxy distribution; they suggest that a significant fraction, more than 50%, of these very blue galaxies are a faint population that lies at nearby redshifts,  $z < 0.3$ .

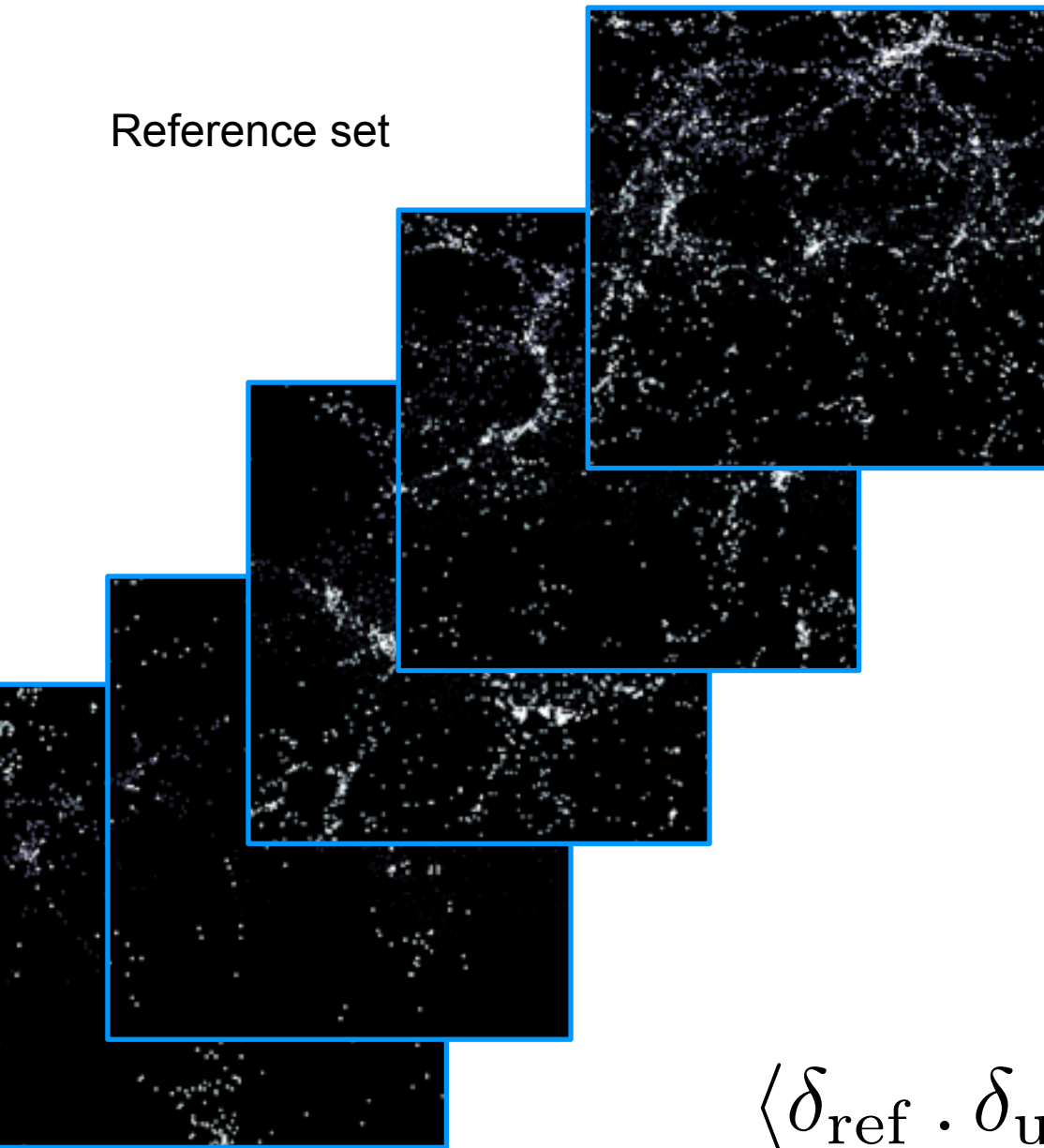


AUTO- AND CROSS-CORRELATIONS BY COLOR BAND

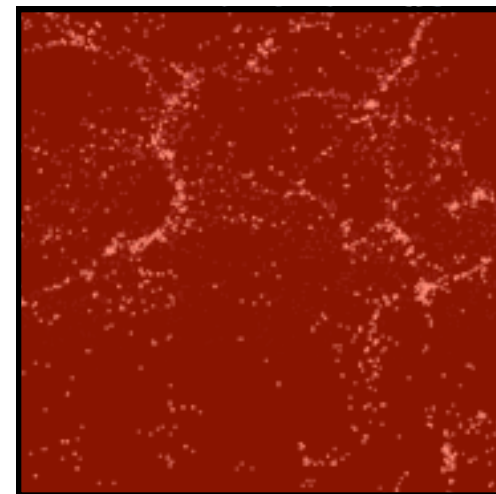
	Blue (20%)	Mid (60%)	Red (20%)
Blue .....	$68 \pm 20$	$9 \pm 7$	$-18 \pm 10$
Mid .....	...	$14 \pm 1$	$20 \pm 9$
Red .....	...	...	$130 \pm 30$

NOTES.—Cross- and autocorrelations between the 20% most extreme blue and red galaxies and the mid 60%, averaged over the two fields. The mean  $A_w$  for all galaxies in the two fields SA 57 and SA 68 was  $18.0 \pm 1.8$ . Given the enhanced amplitude of the autocorrelations for the red and blue subsets, together with the weak negative cross-correlation between them, we conclude that these subsets are disparate populations.

Reference set

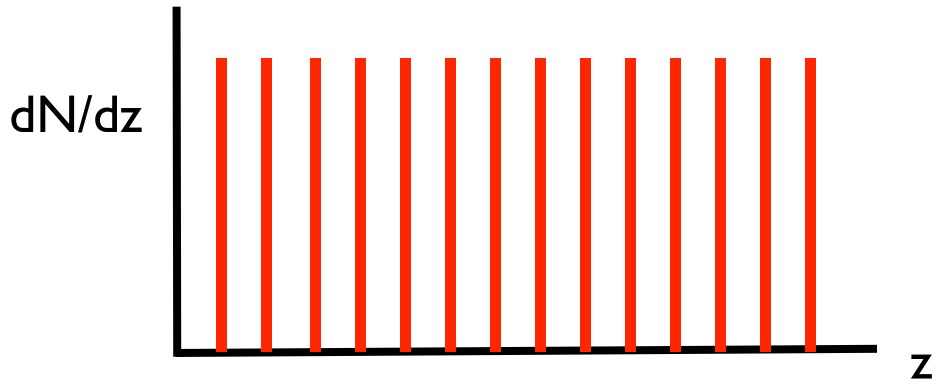
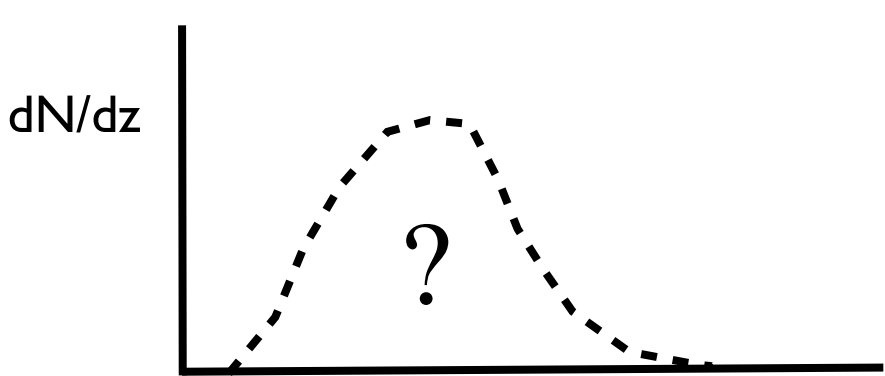


Sample at unknown redshift

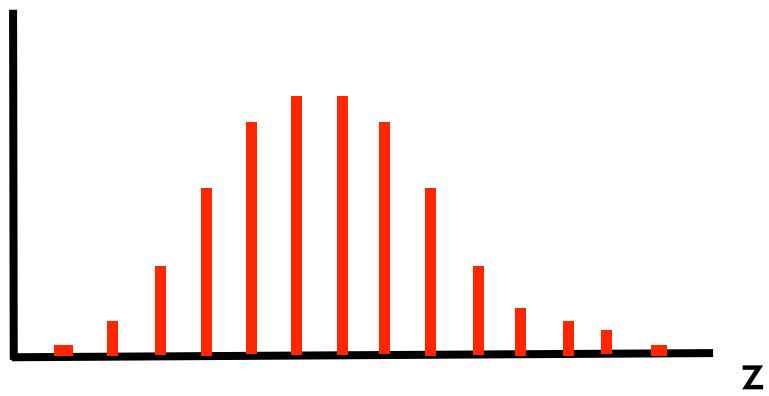


$$\langle \delta_{\text{ref}} \cdot \delta_{\text{unknown}} \rangle$$

Metric: 2-point correlation function

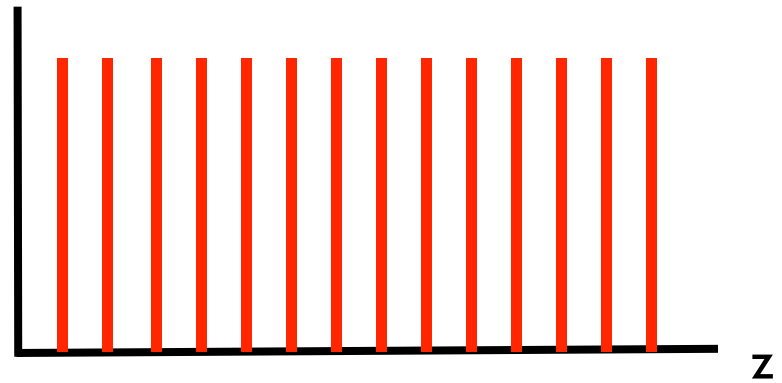
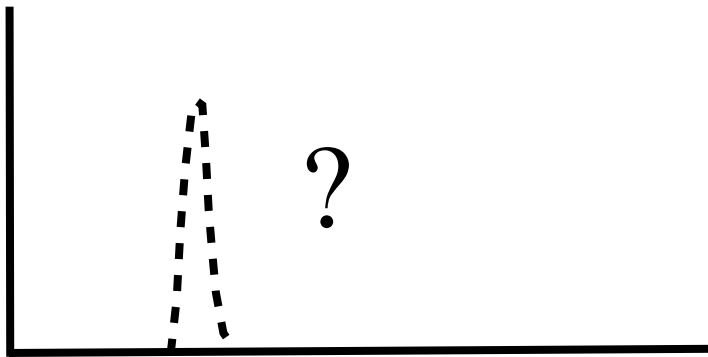


$$\langle \partial_{\text{unknown}} \cdot \partial_{\text{reference}} \rangle$$

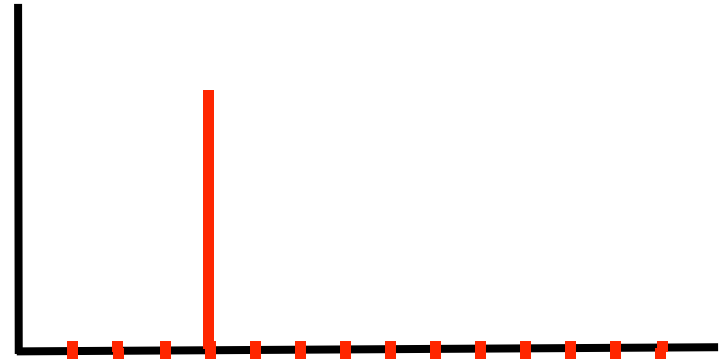


$$\bar{w}_{ur}(z) \sim \int dz' \frac{dN_u}{dz'} \frac{dN_r}{dz'} \bar{b}_u(z') \bar{b}_r(z') \bar{w}(z')$$

$$\langle \partial_{\text{unknown}} \cdot \partial_{\text{reference}} \rangle$$



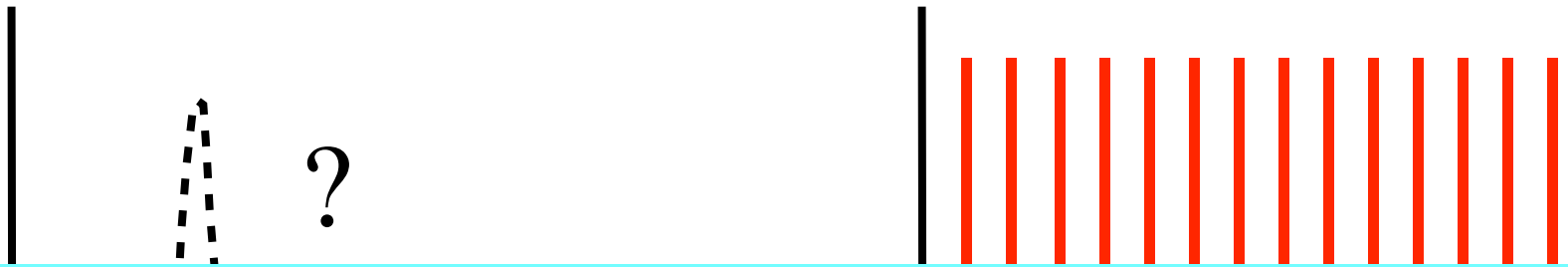
if  $\frac{d \log dN/dz}{dz} \gg \frac{d \log b_u(z)}{dz}$



then  $dN/dz \propto \bar{w}_{ur}(z) \left( \frac{1}{\bar{b}_r(z) \bar{w}(z)} \right)$

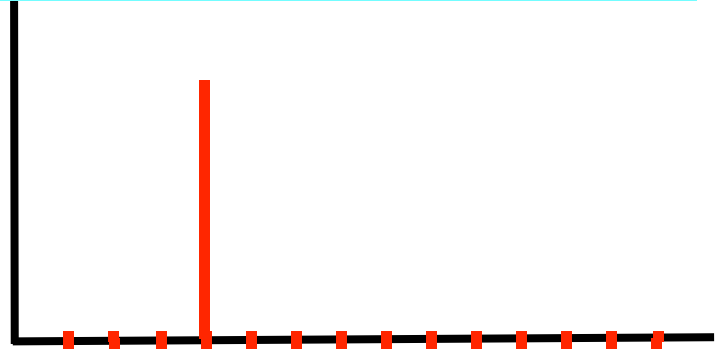
and the redshift distribution is simply normalized by  $\int dz dN/dz = N_{\text{tot}}$

$$\langle \partial_{\text{unknown}} \cdot \partial_{\text{reference}} \rangle$$



The key point here is to do a local sampling in the space of observables

$$\text{if } \frac{d \log dN/dz}{dz} \gg \frac{d \log b_u(z)}{dz}$$



$$\text{then } dN/dz \propto \bar{w}_{ur}(z) \left( \frac{1}{\bar{b}_r(z) \bar{w}(z)} \right)$$

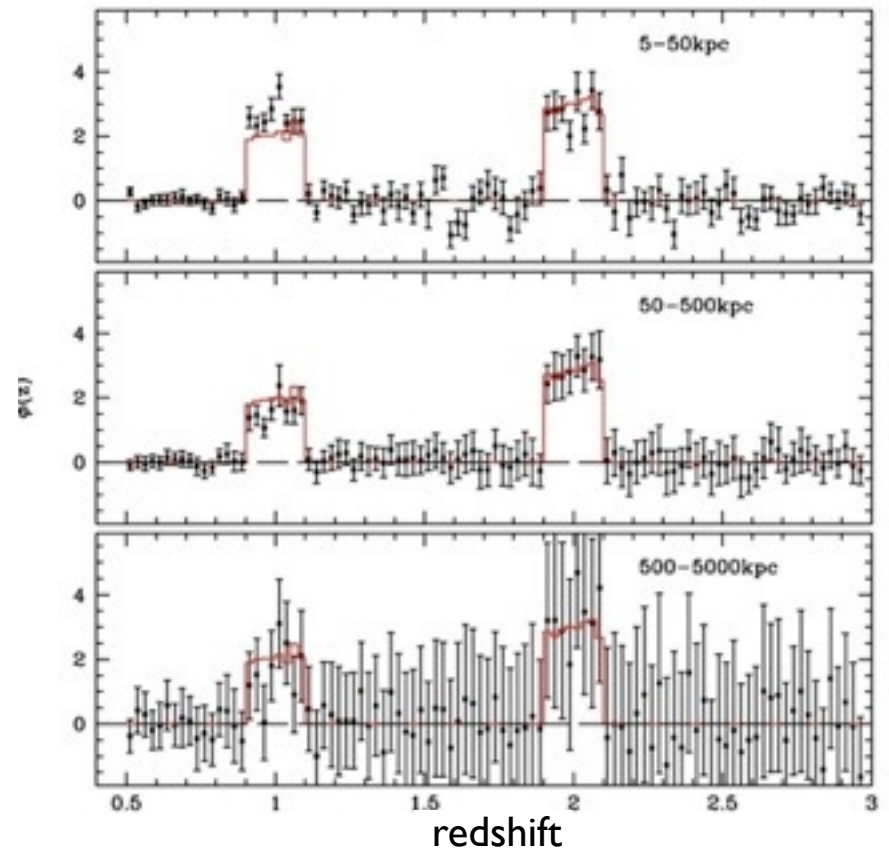
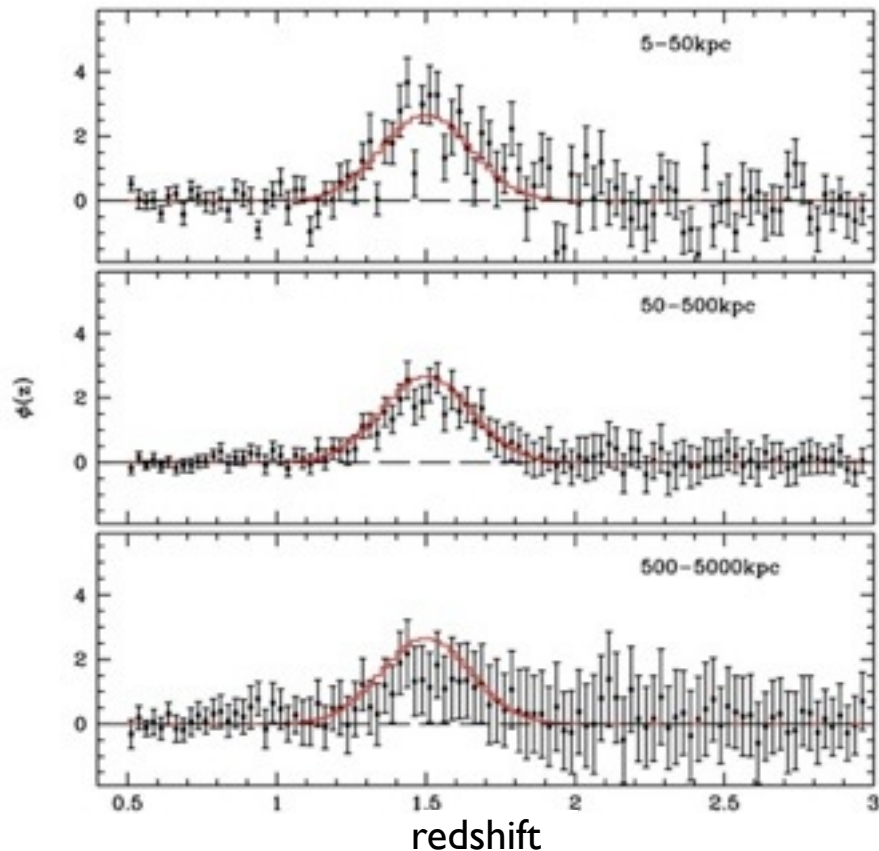
and the redshift distribution is simply normalized by

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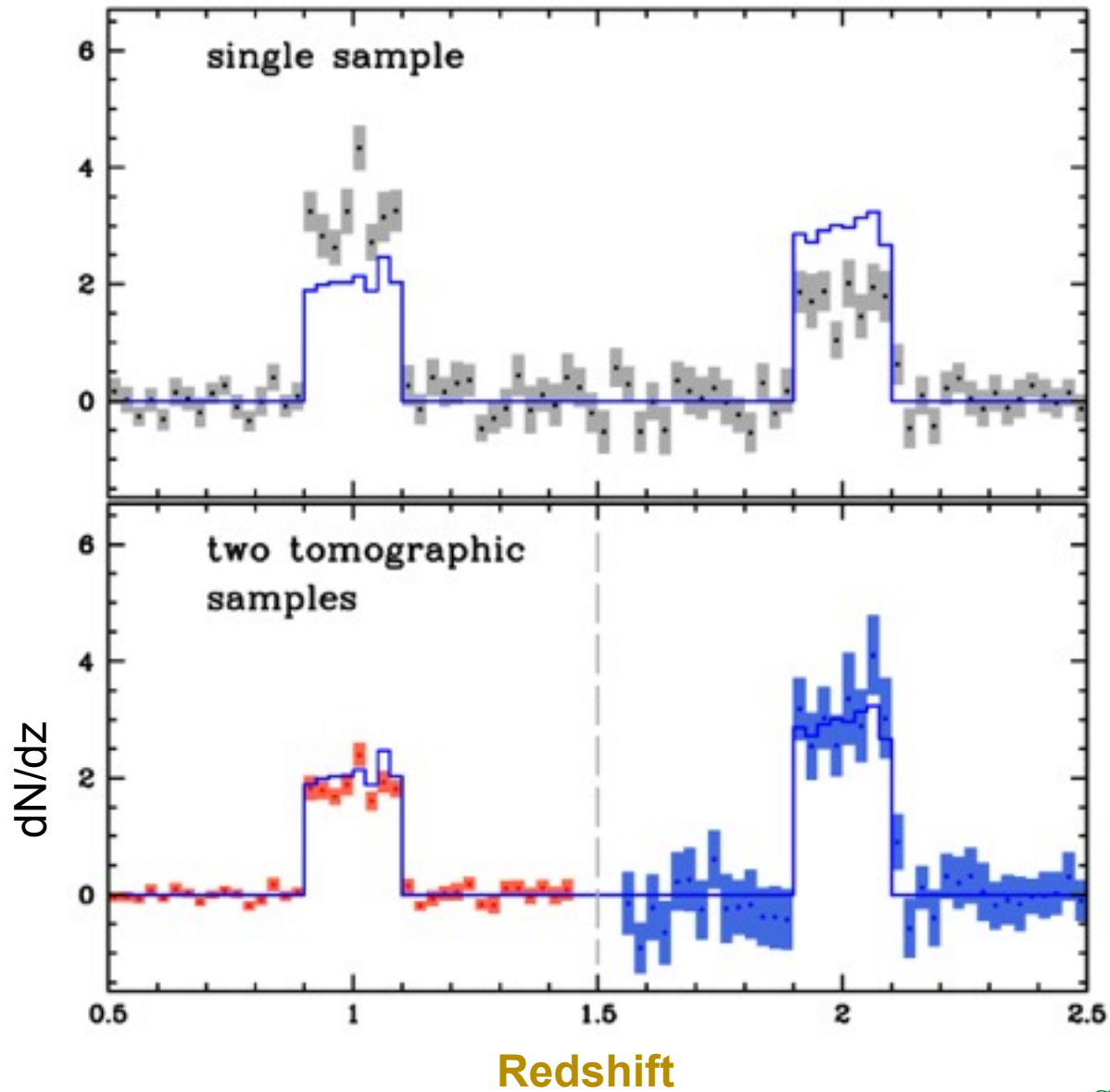
# Scale dependence of the results

- Clustering exists on all scales but with different amplitudes. The dependence on scale can be explored with simulations



- ▶ The results depend only weakly on scale
- ▶ There is plenty of signal to be extracted down to small scales

# Bimodal redshift distributions

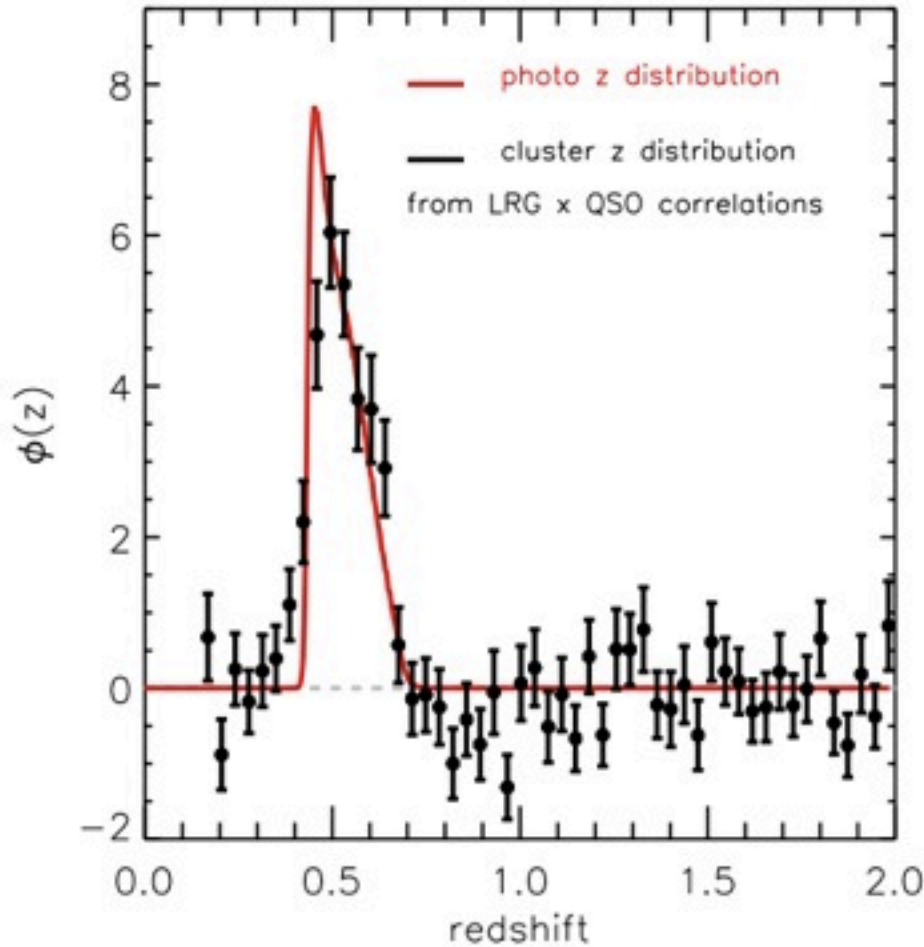


**Application to real datasets:**

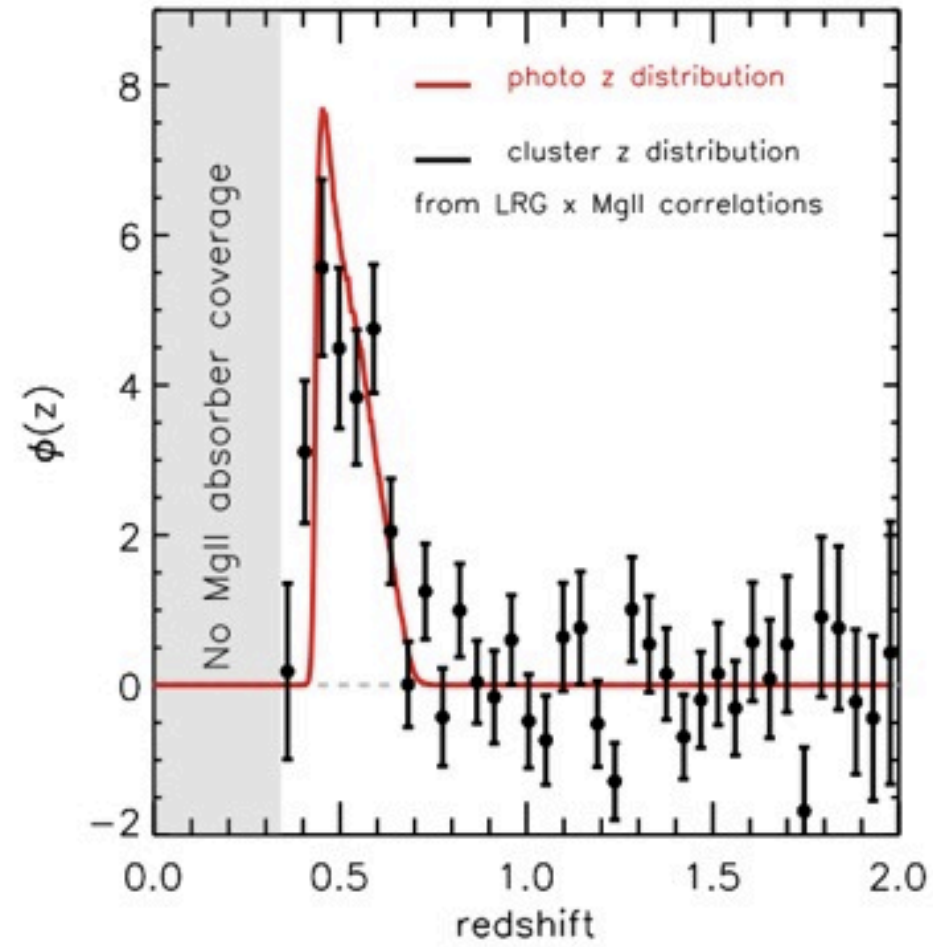
**reference sample: spectroscopic**  
**‘unknown’ sample: photometric**

# clustering-based redshifts

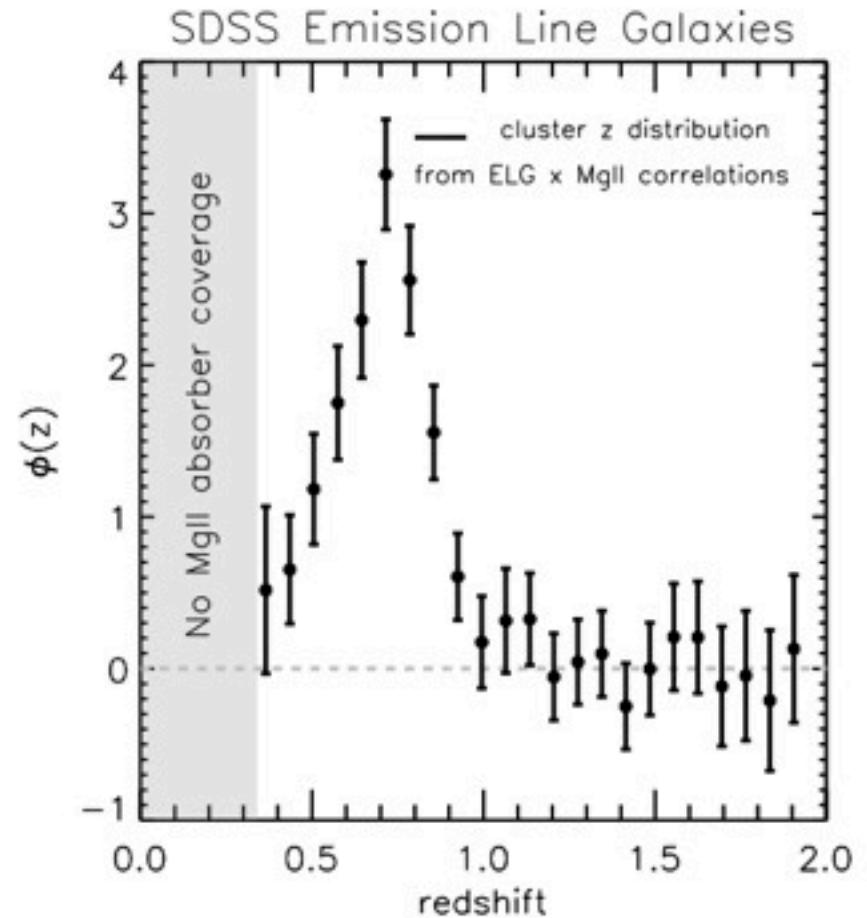
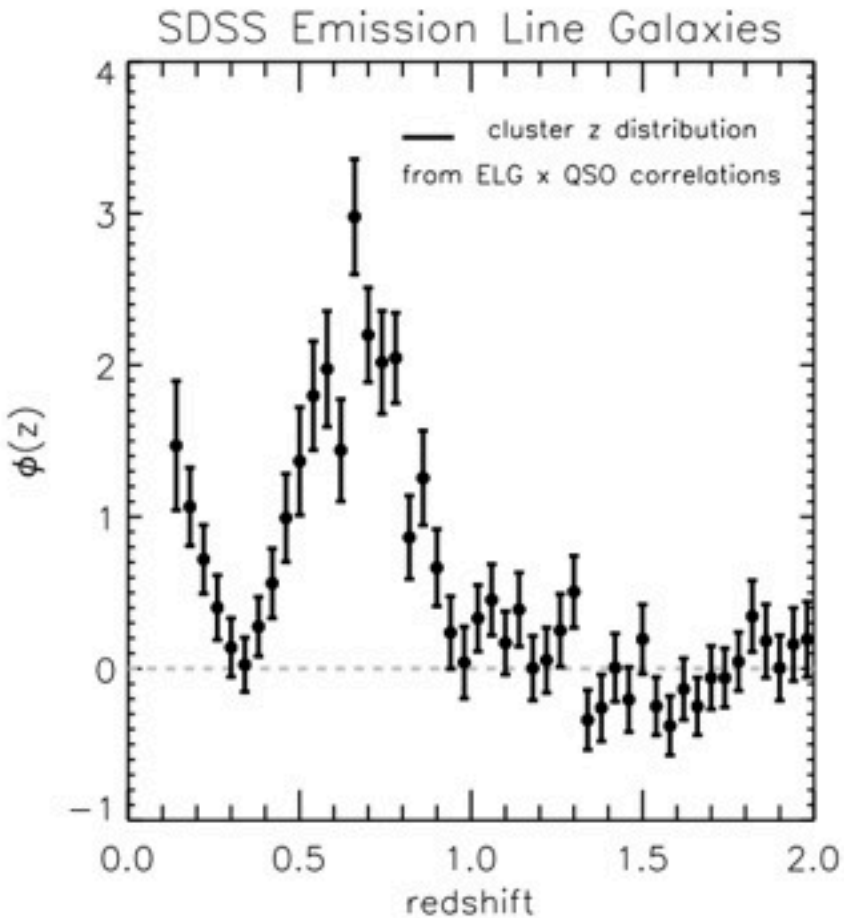
SDSS Luminous Red Galaxies



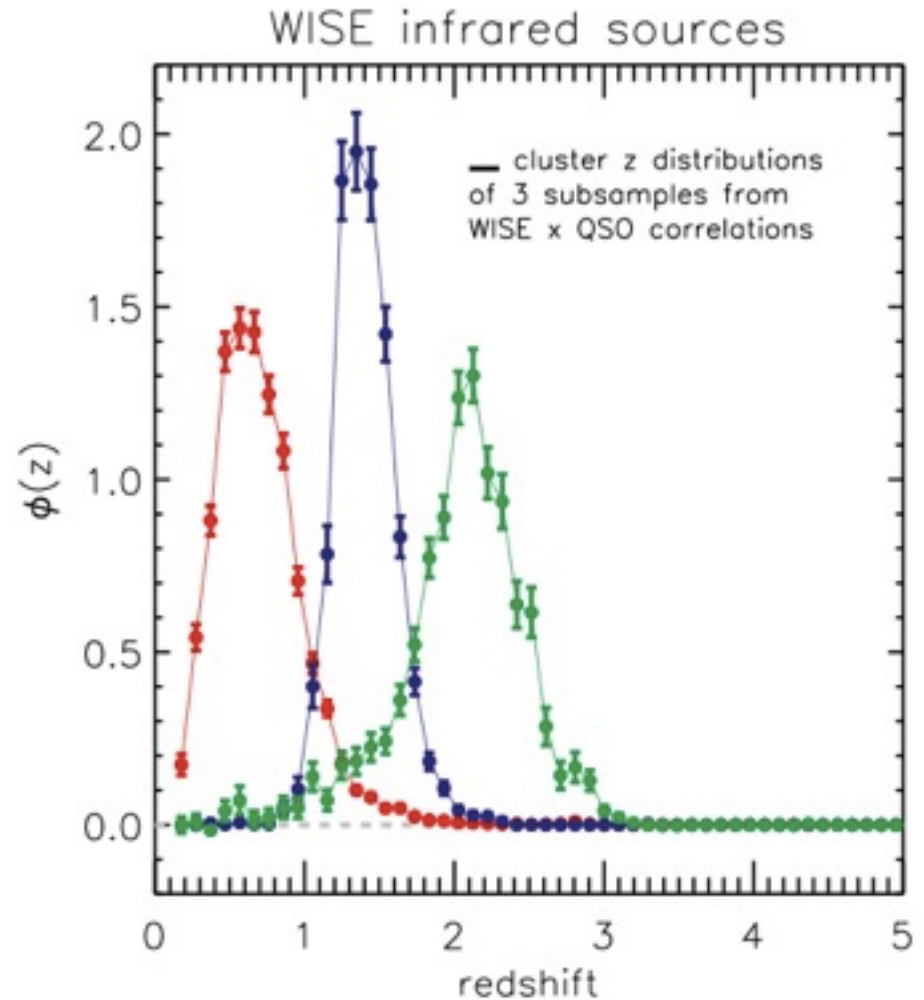
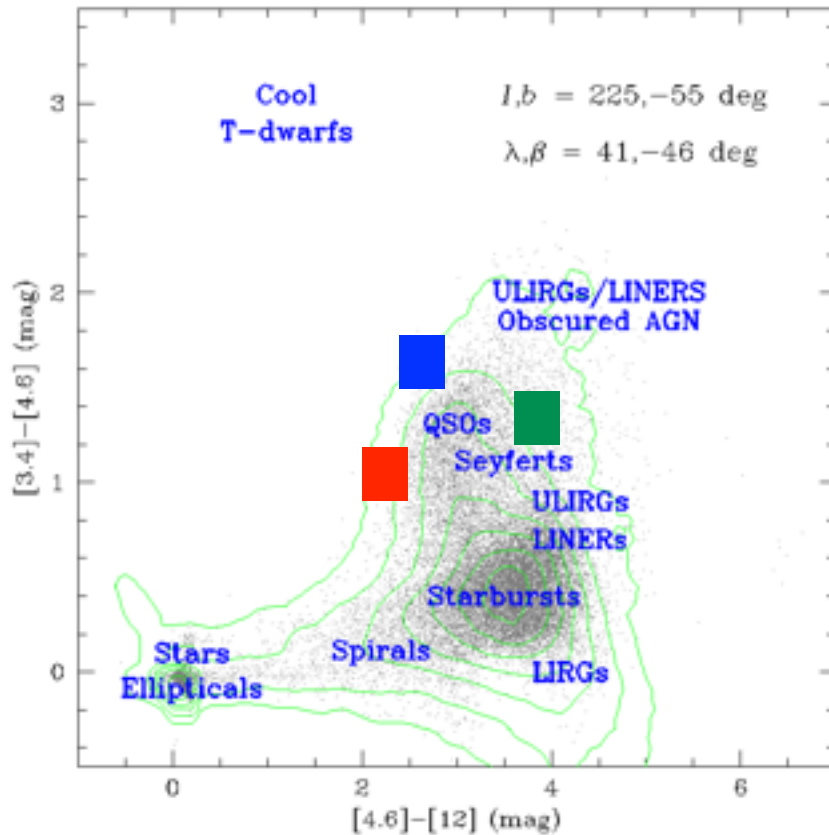
SDSS Luminous Red Galaxies



# clustering-based redshifts

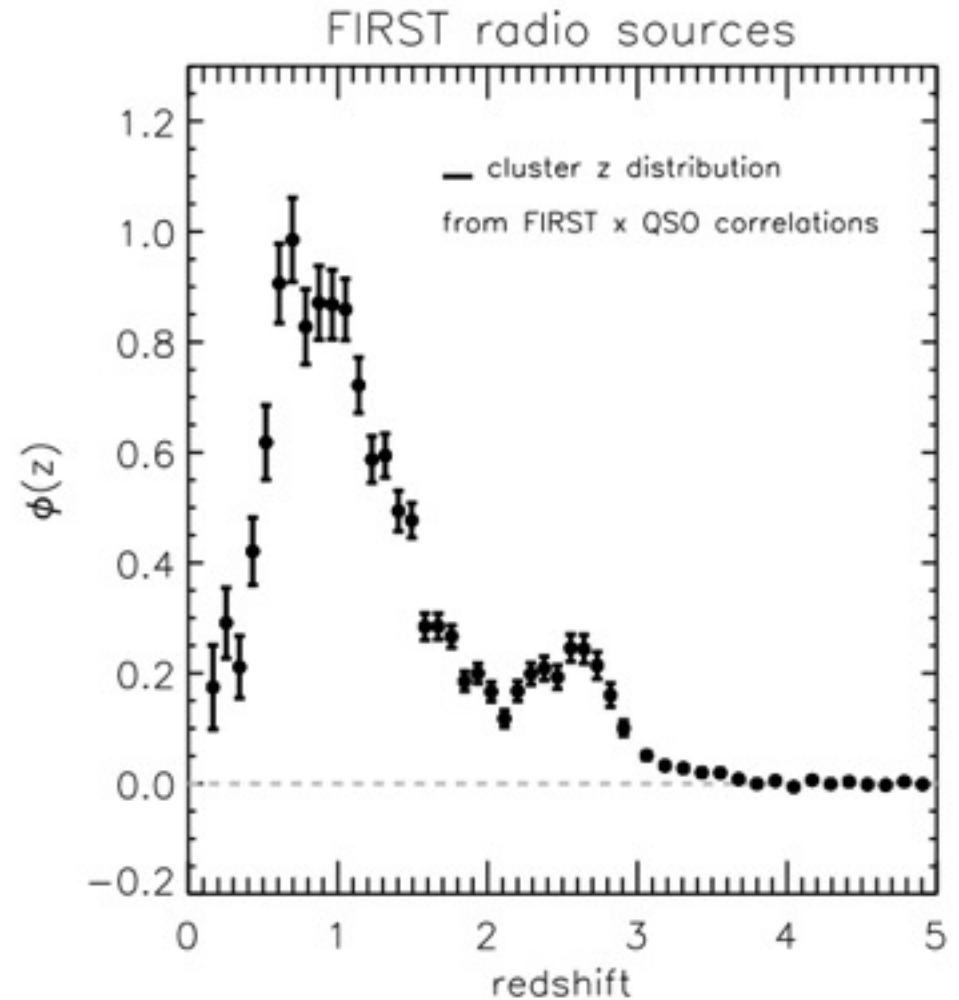


# clustering-based redshifts



# clustering-based redshifts

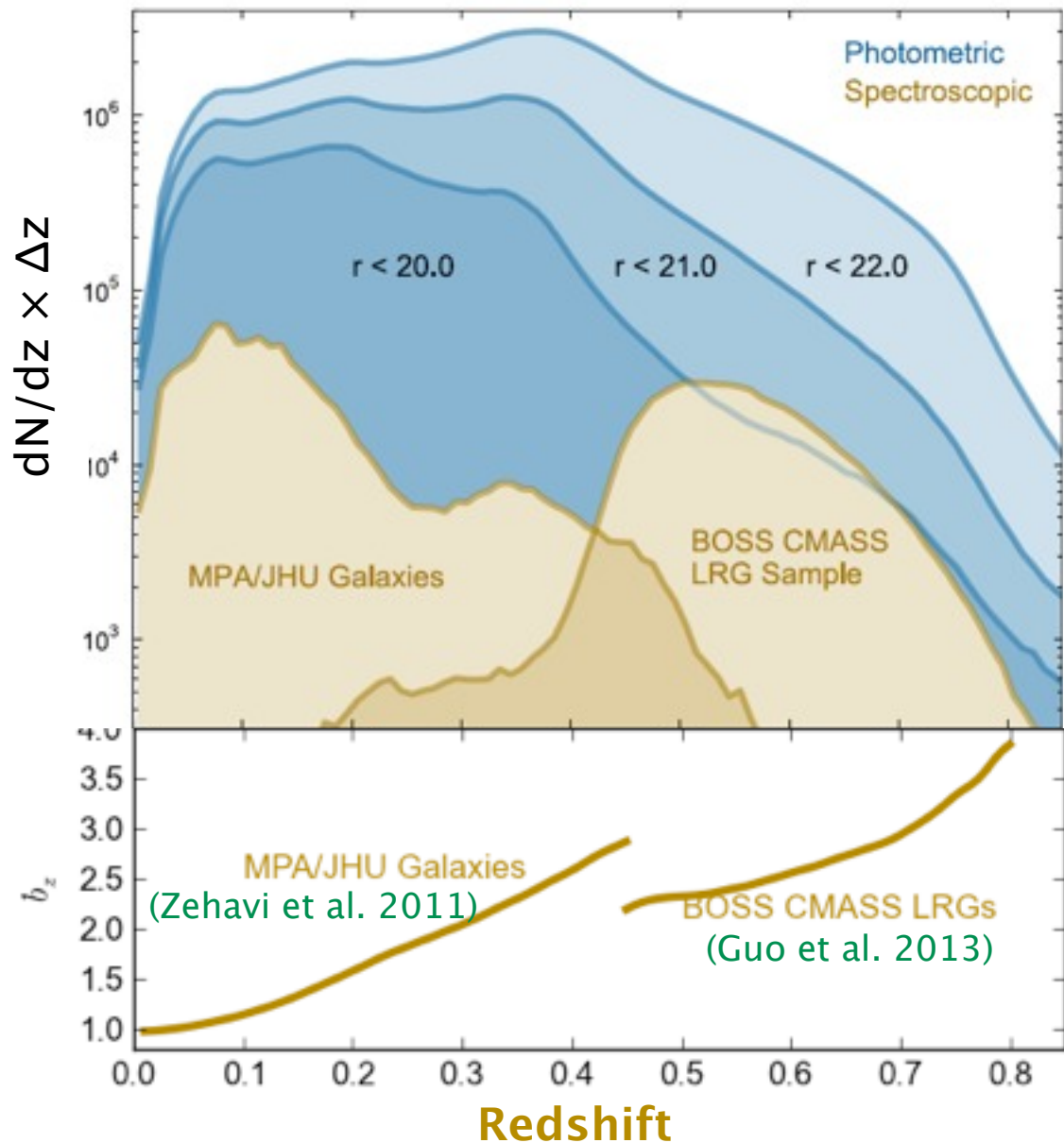
## The FIRST VLA



# **Exploration of the SDSS photometric galaxies**



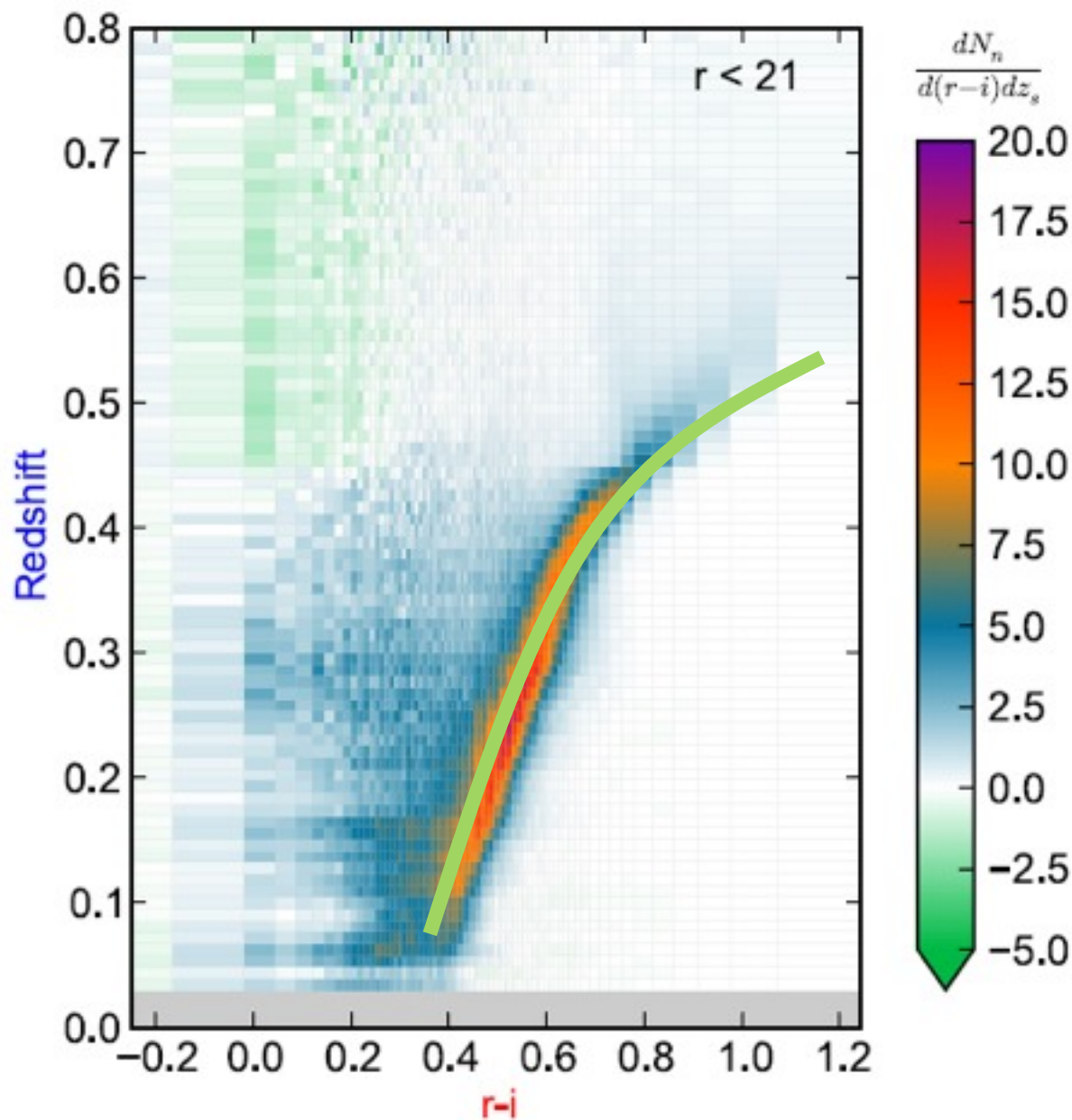
# Characterizing photometric galaxies



The (spectroscopic) reference sample is much smaller and does not need to be representative of the unknown galaxies

# Cluster-z distribution of a color-selected sample

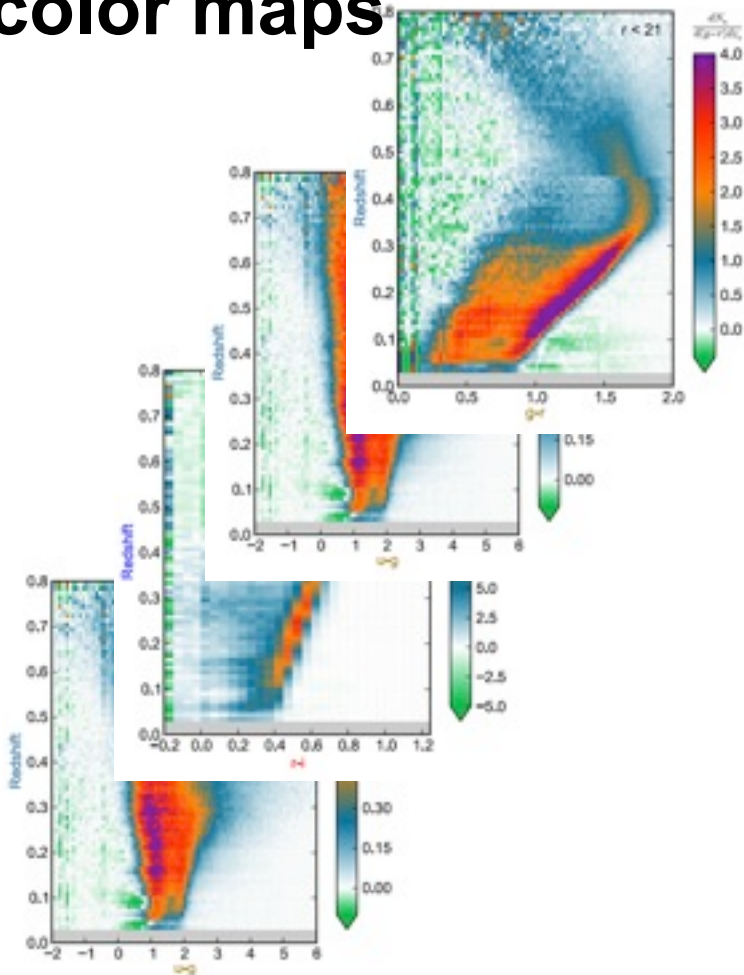
- Assembling clustering redshift distribution of all r-i selected samples
- 80 slices in r-i
- 80 slices in z ( $\Delta z \sim 10^{-2}$ )
- 6400 cross-correlation measurements



# Reducing the dimensionality of the problem

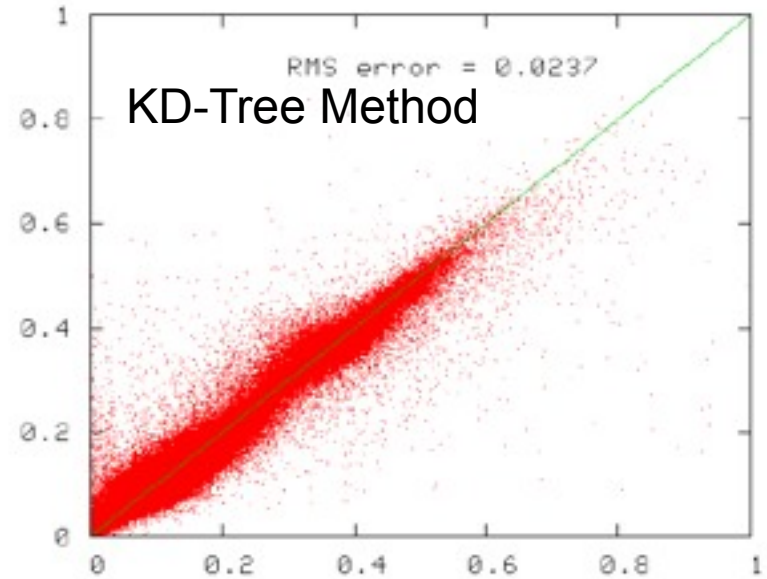
4 independent color maps

Reducing to one dimension



KD-Tree photometric redshifts

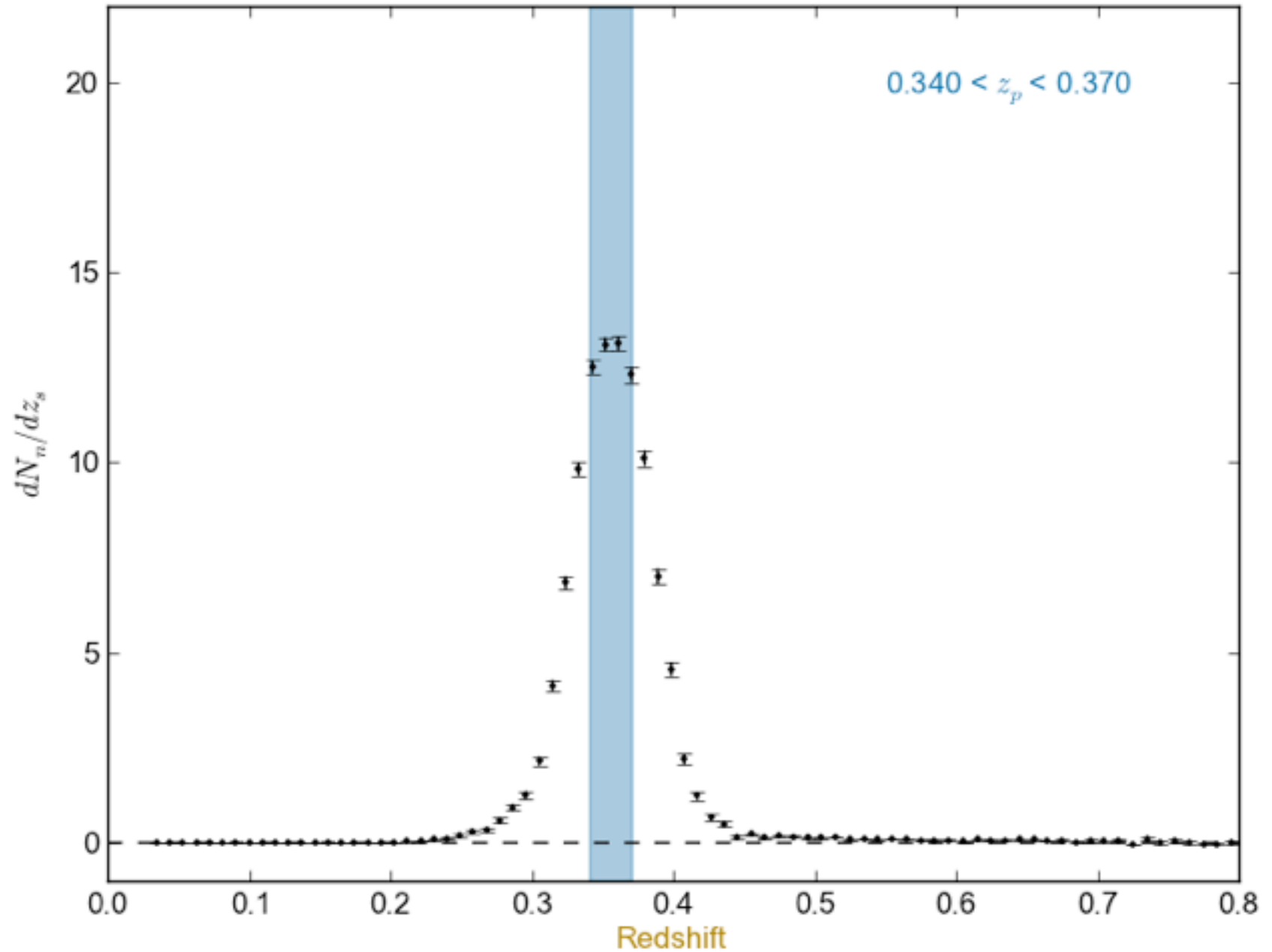
Photometric Redshift



Redshift

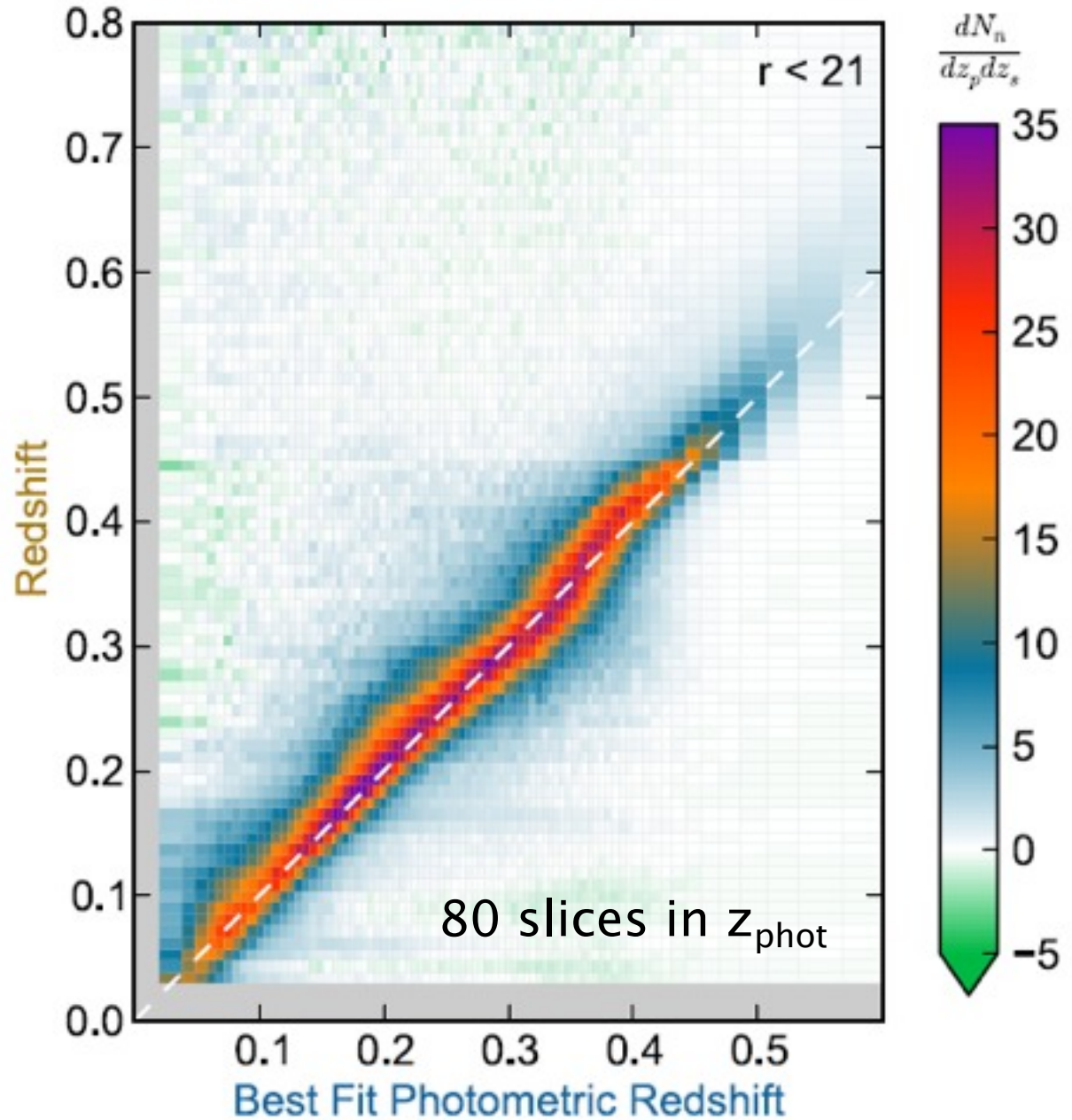
(Csabai et al. 2007)

# Clustering redshift distribution

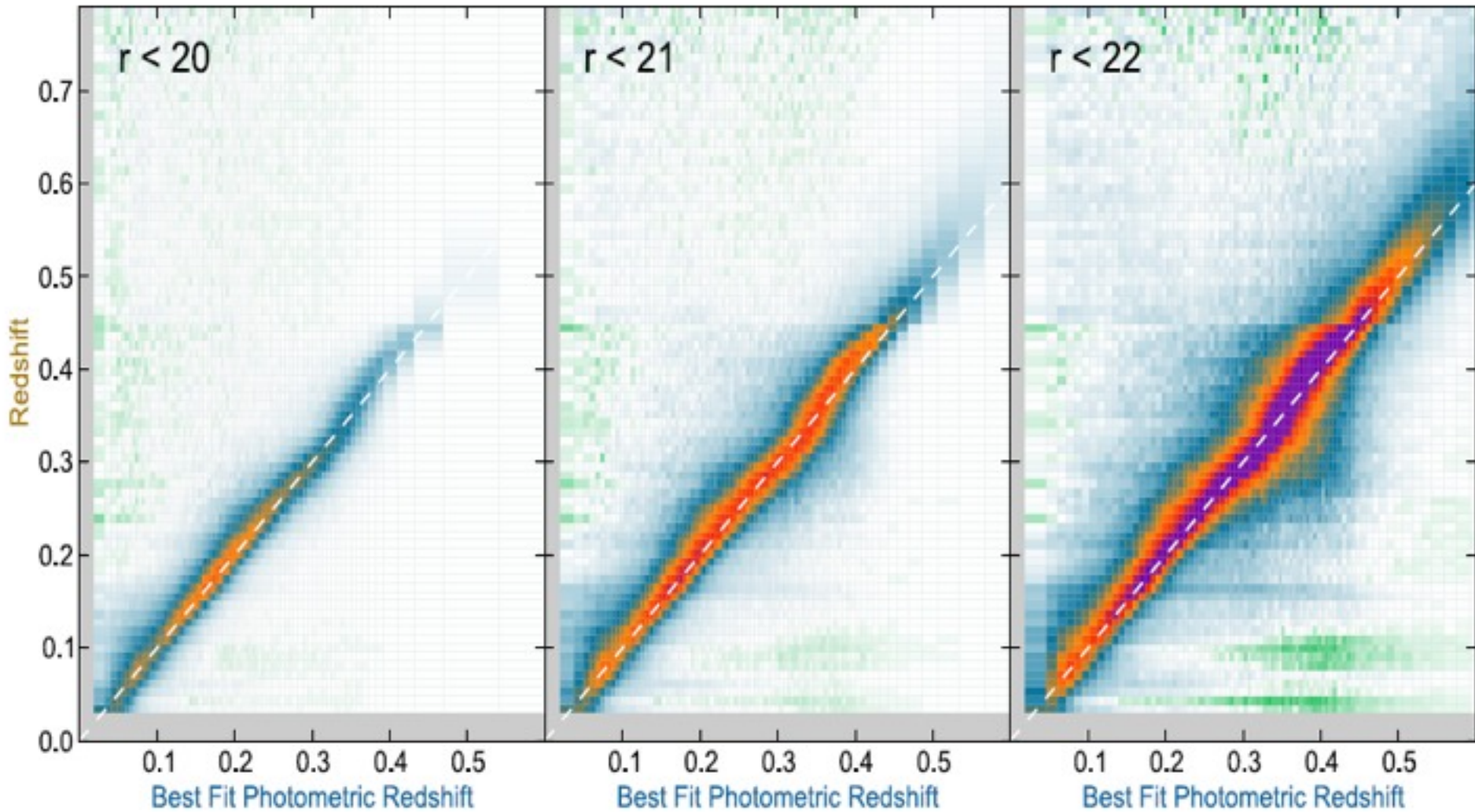


# Density map of clustering-z distribution

80 slices in  $z$   
( $\Delta z \sim 10^{-2}$ )



# Effect of limiting magnitude

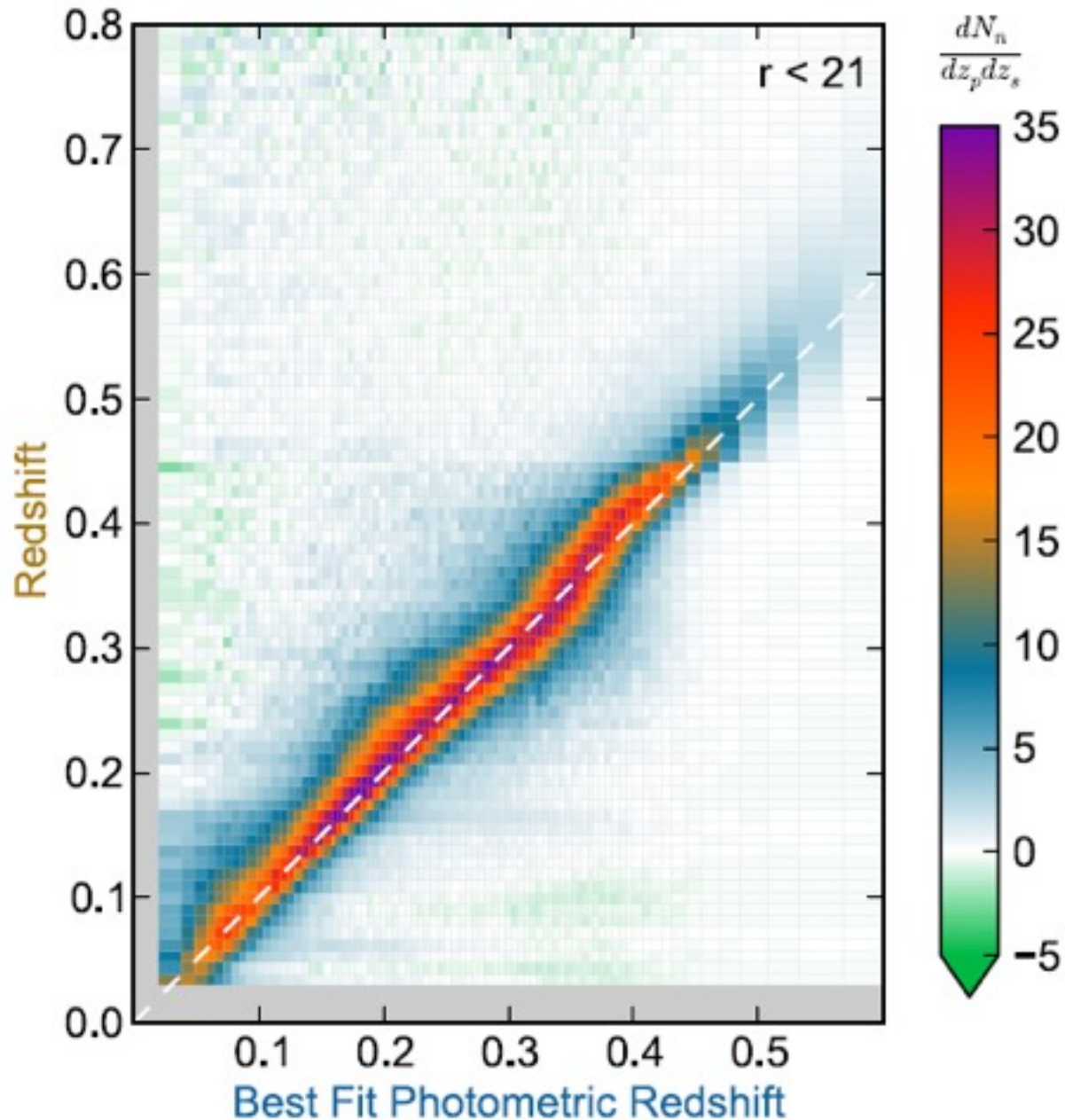


18 Million Objects

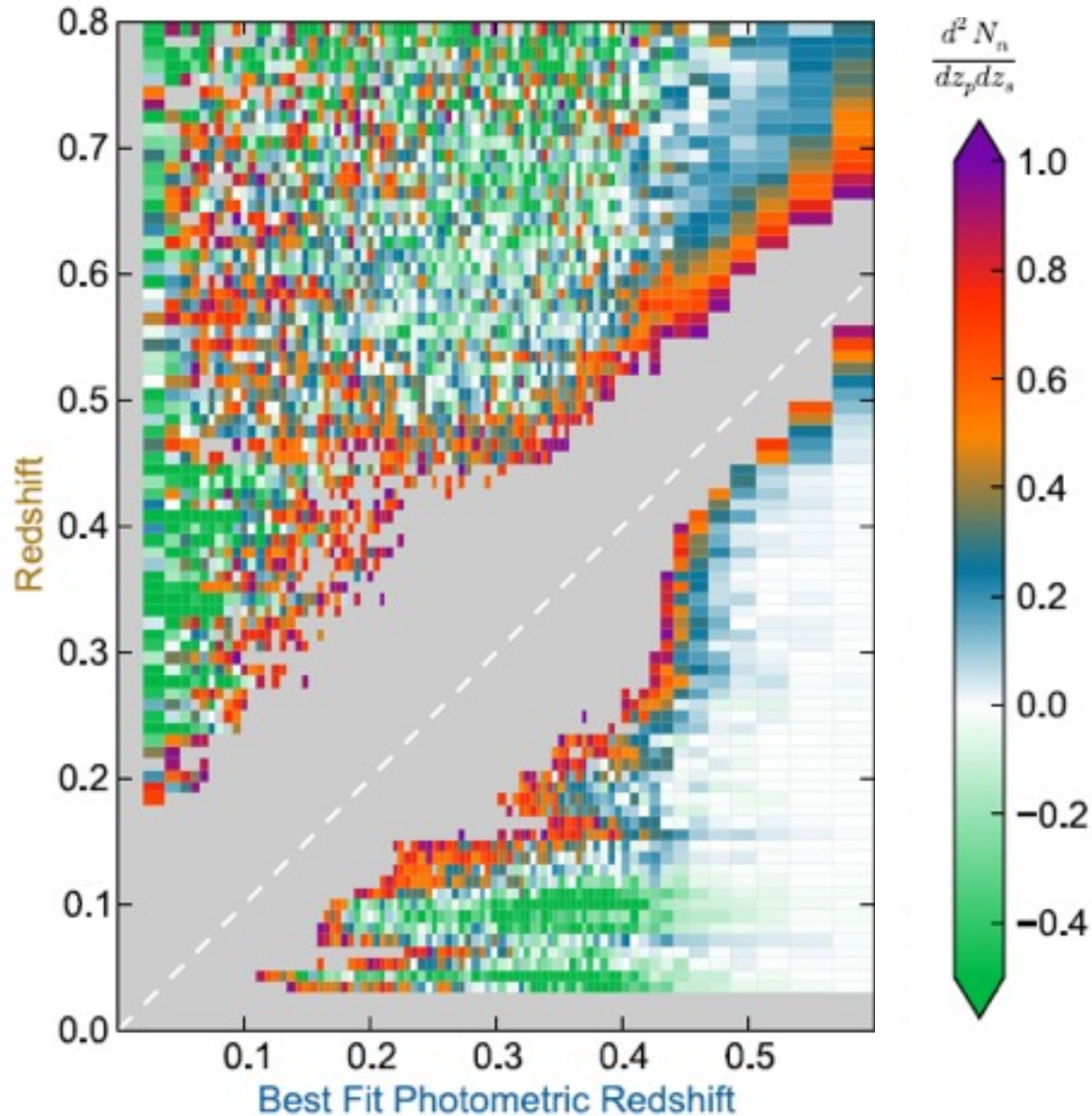
47 Million Objects

110 Million Objects

# Density map of clustering-z distribution



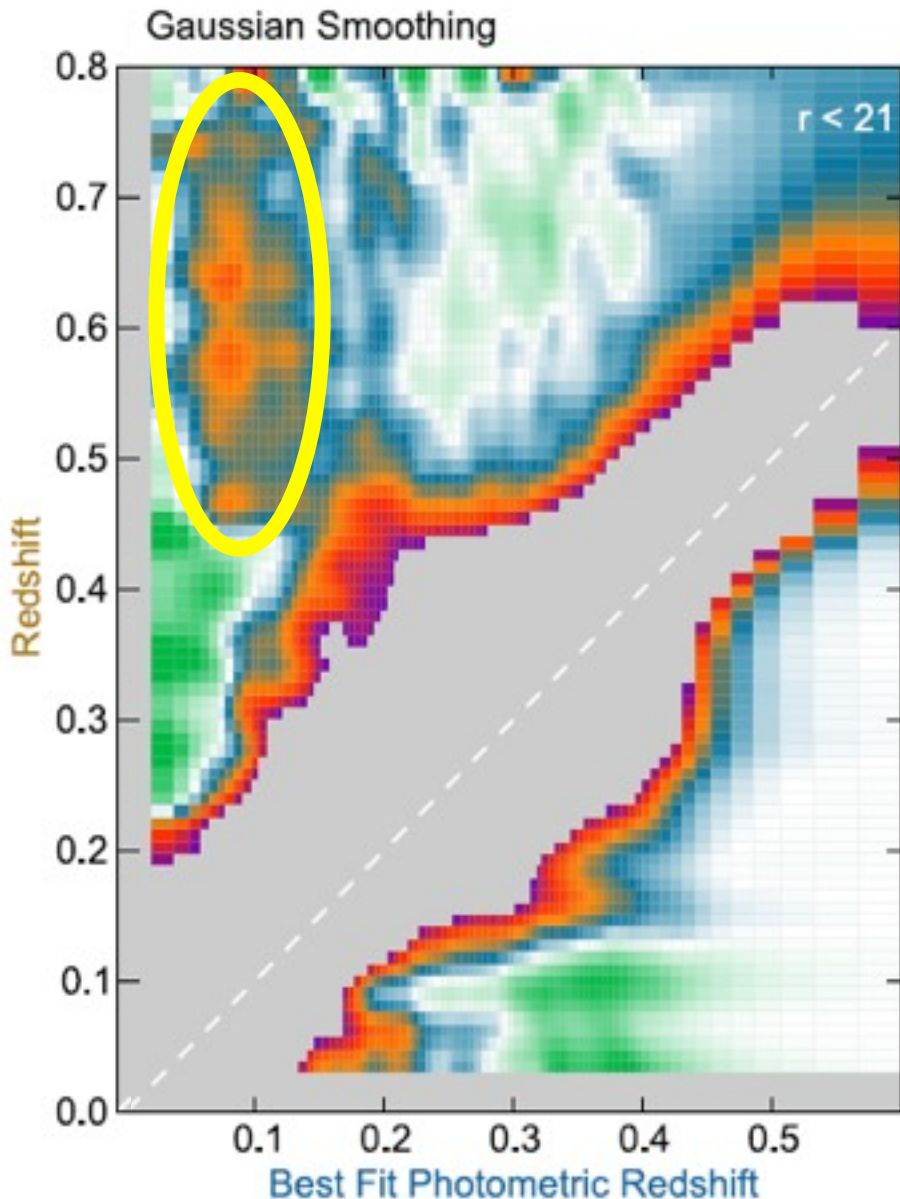
# Density map of clustering-z distribution



Low-level Features



# Locating the Emission Line Galaxies (ELGs)

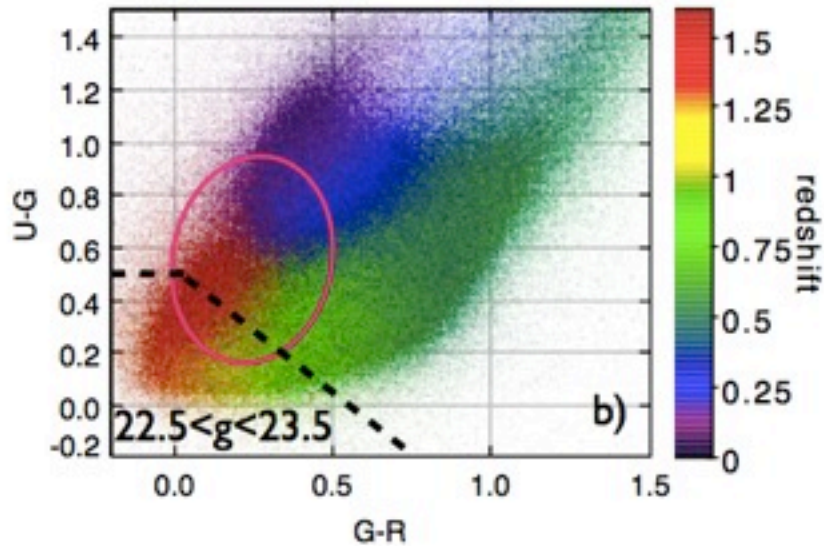
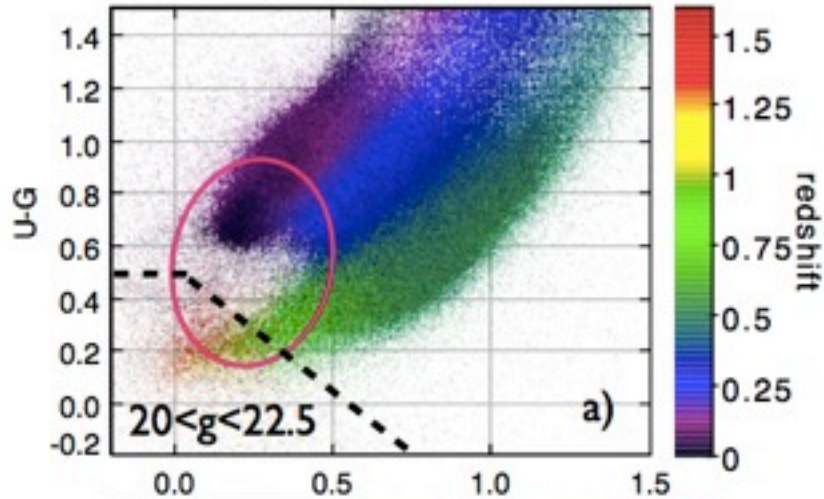


- Star forming (blue) galaxies at high  $z$
- Colours dominated by emission lines: O III, O II and H $\beta$
- Problematic for **photo- $z$**  estimates
- we could have discovered them a long time ago
- They have become key populations for upcoming surveys

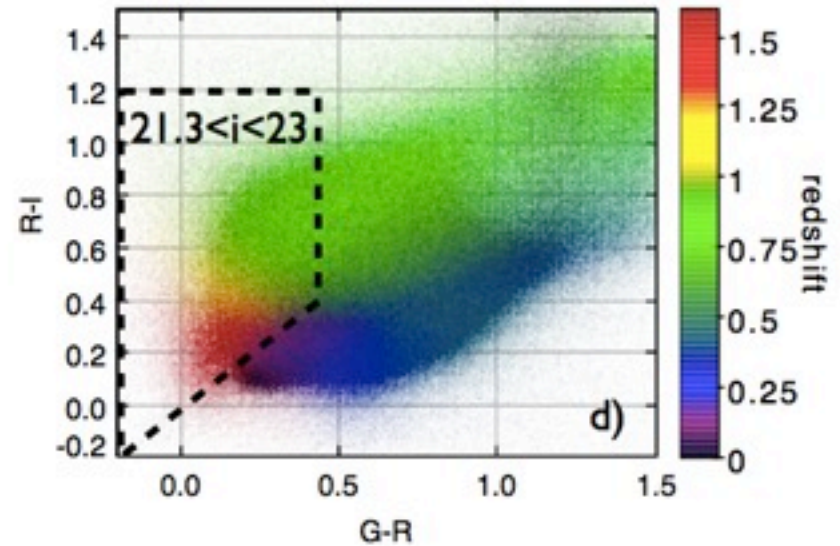
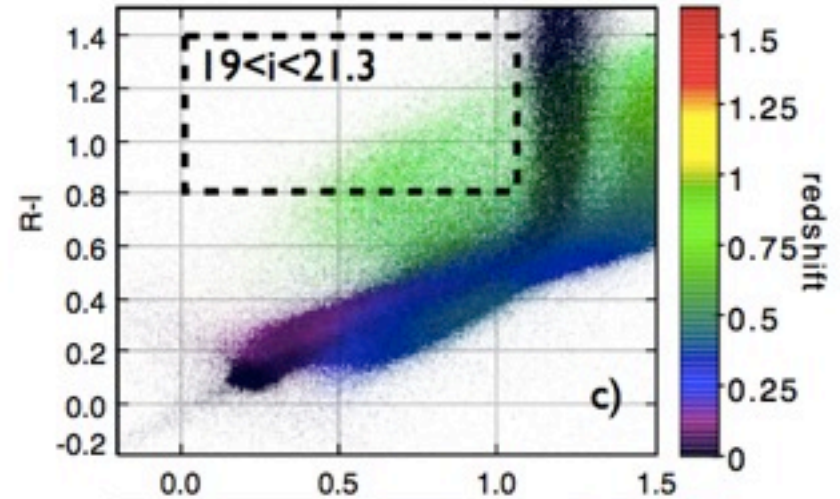
# Photometric selection of ELGs

Goal: selecting galaxies with  $0.6 < z < 1.7$

the “ugr” selection



the “gri” selection



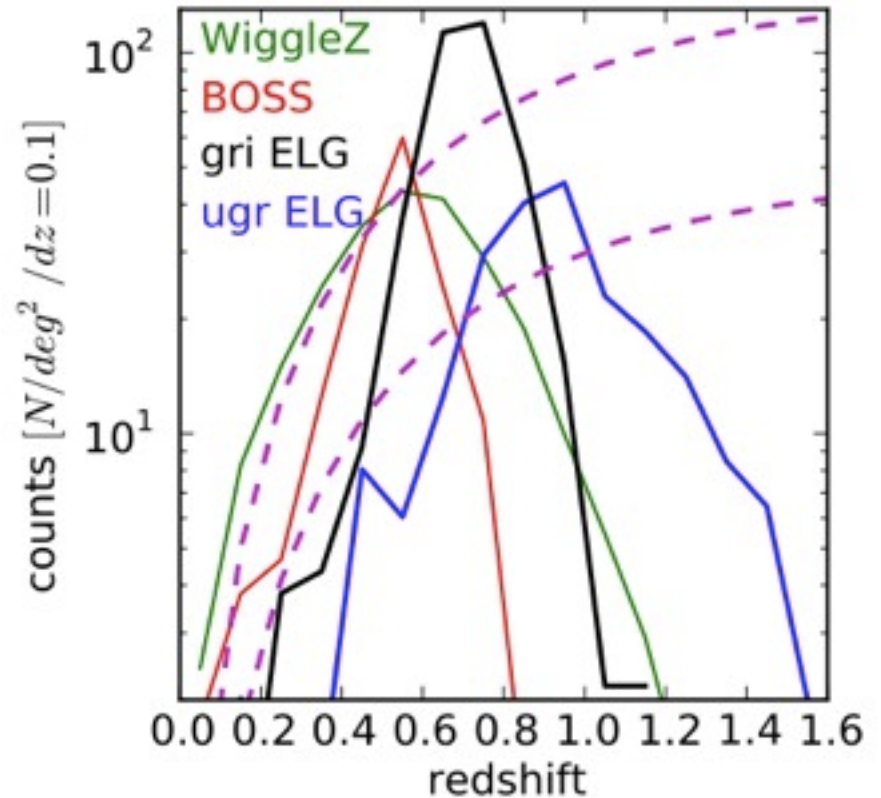
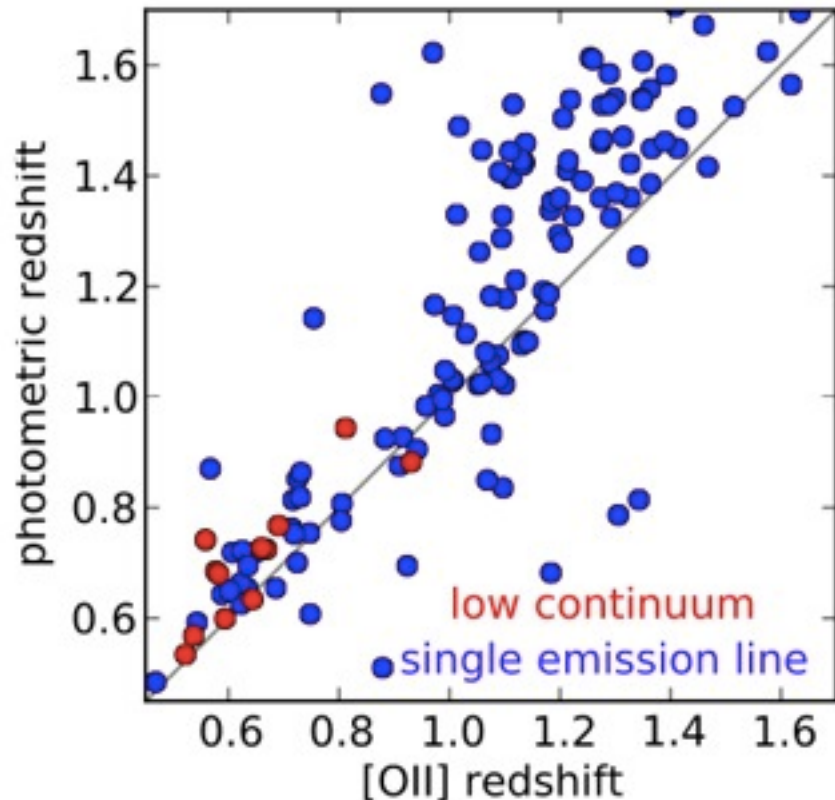
Comparat, Kneib et al. et al. (2012)

# Photometric selection of ELGs

ELG SDSS-III/BOSS ancillary program, 2000 spectra:

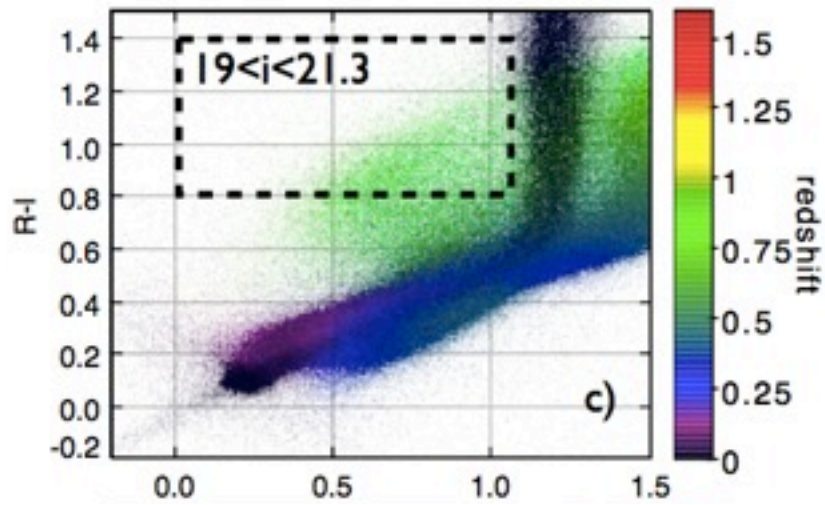
**Objects with robust redshifts:** blue galaxies, red galaxies, QSOs,

**Objects with unreliable redshifts:** single emission line, low continuum level, bad quality data

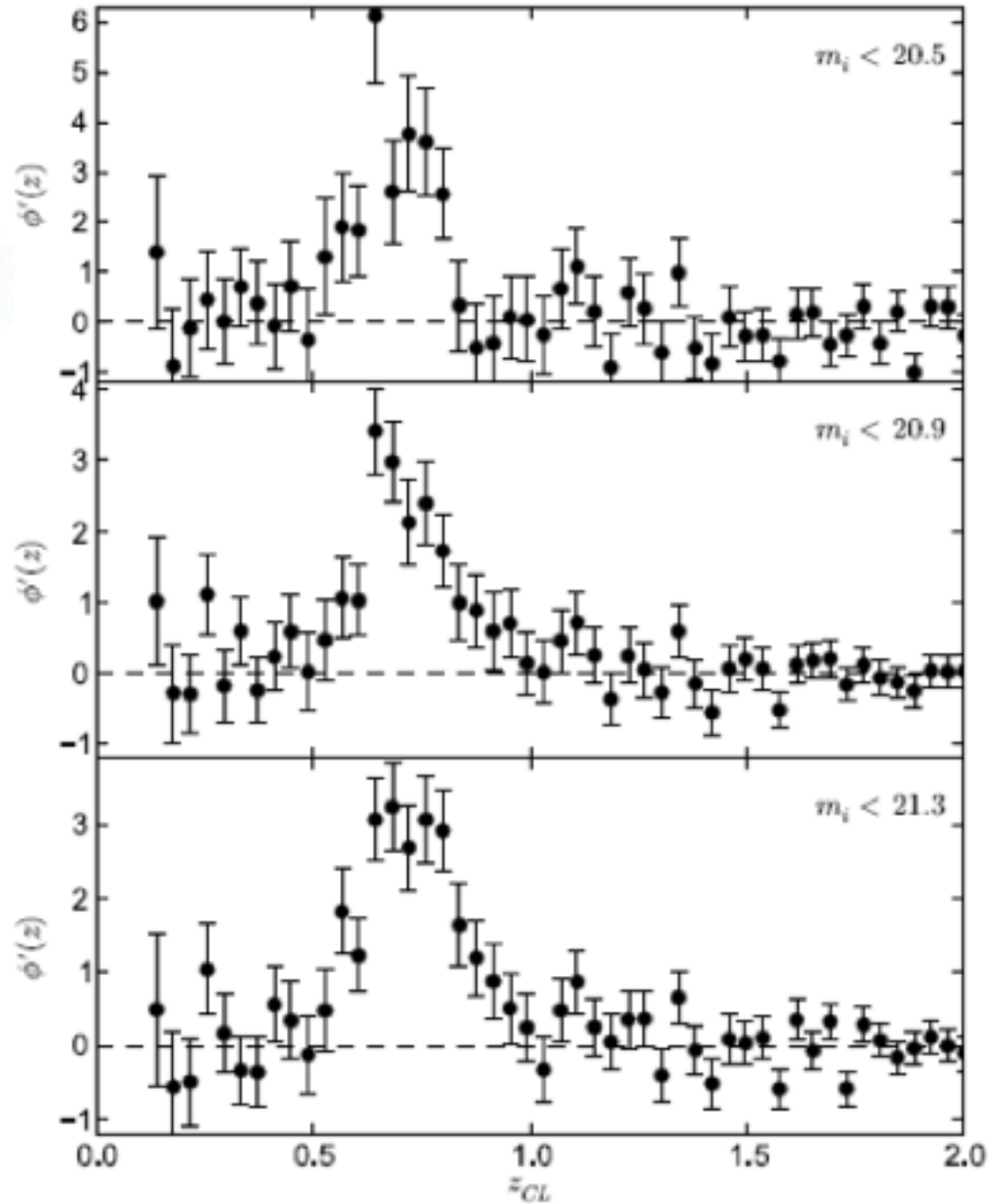


Comparat, Kneib et al. et al. (2012)

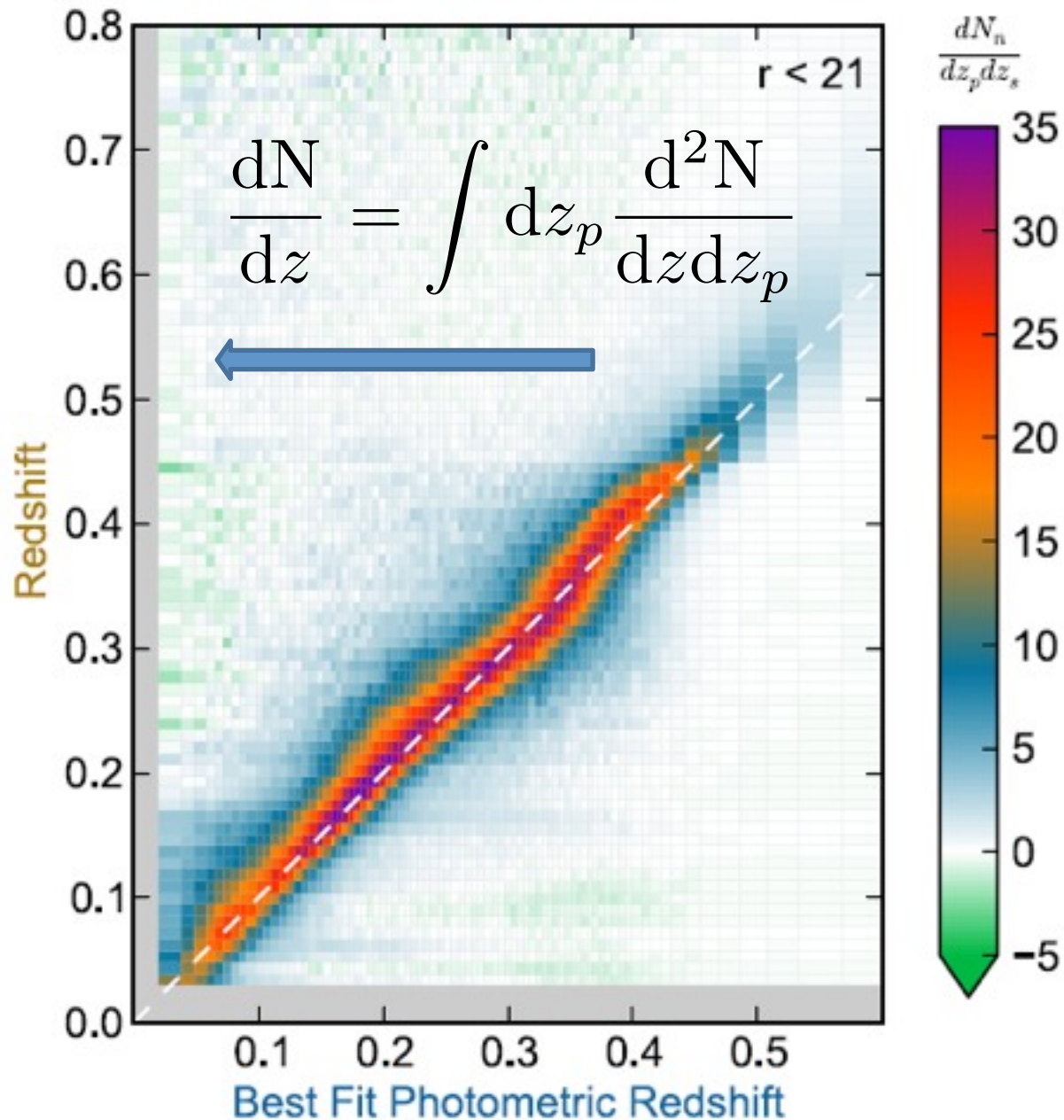
# ELG redshift distributions



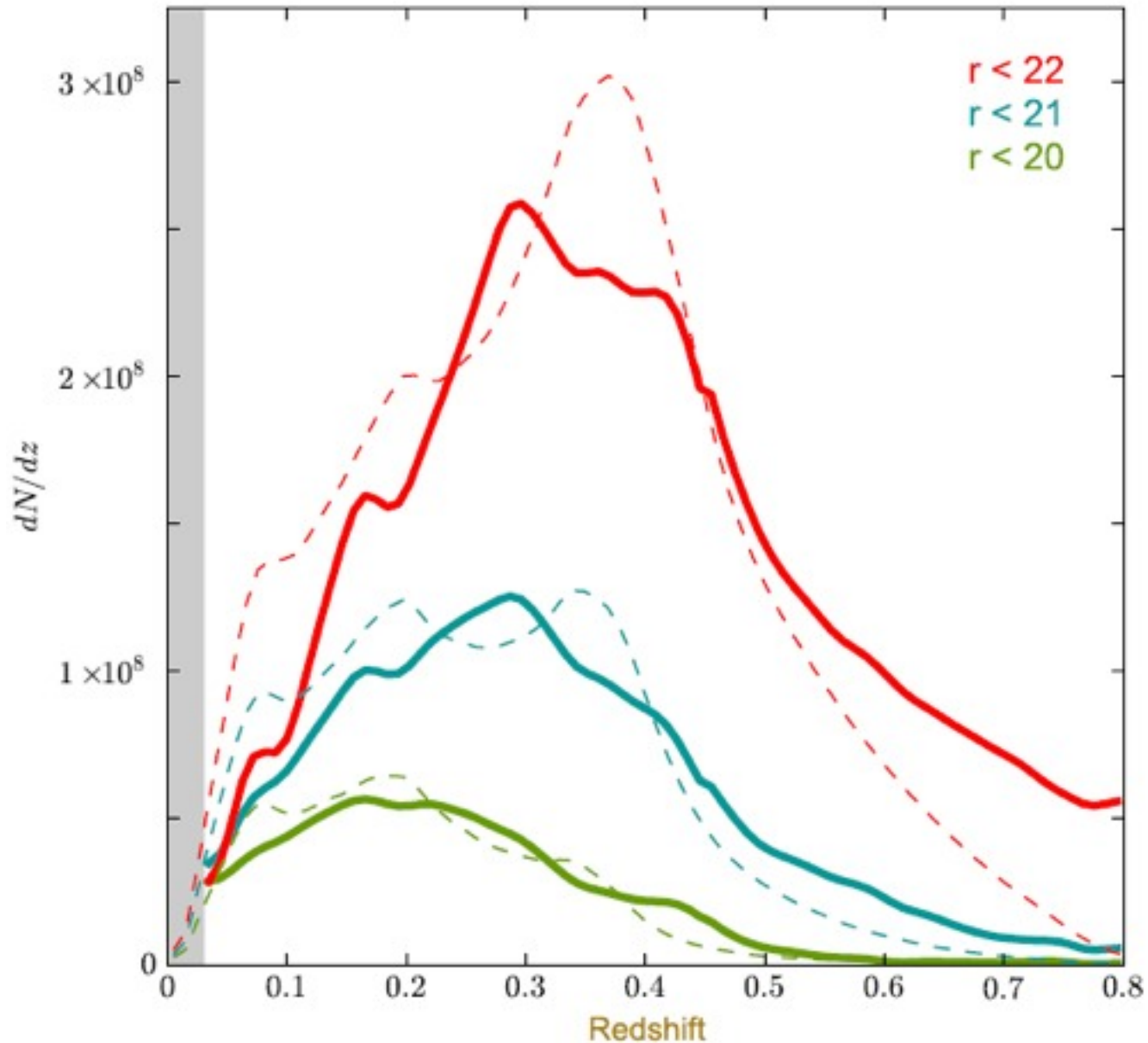
gri selection from  
Comparat et al. (2013)



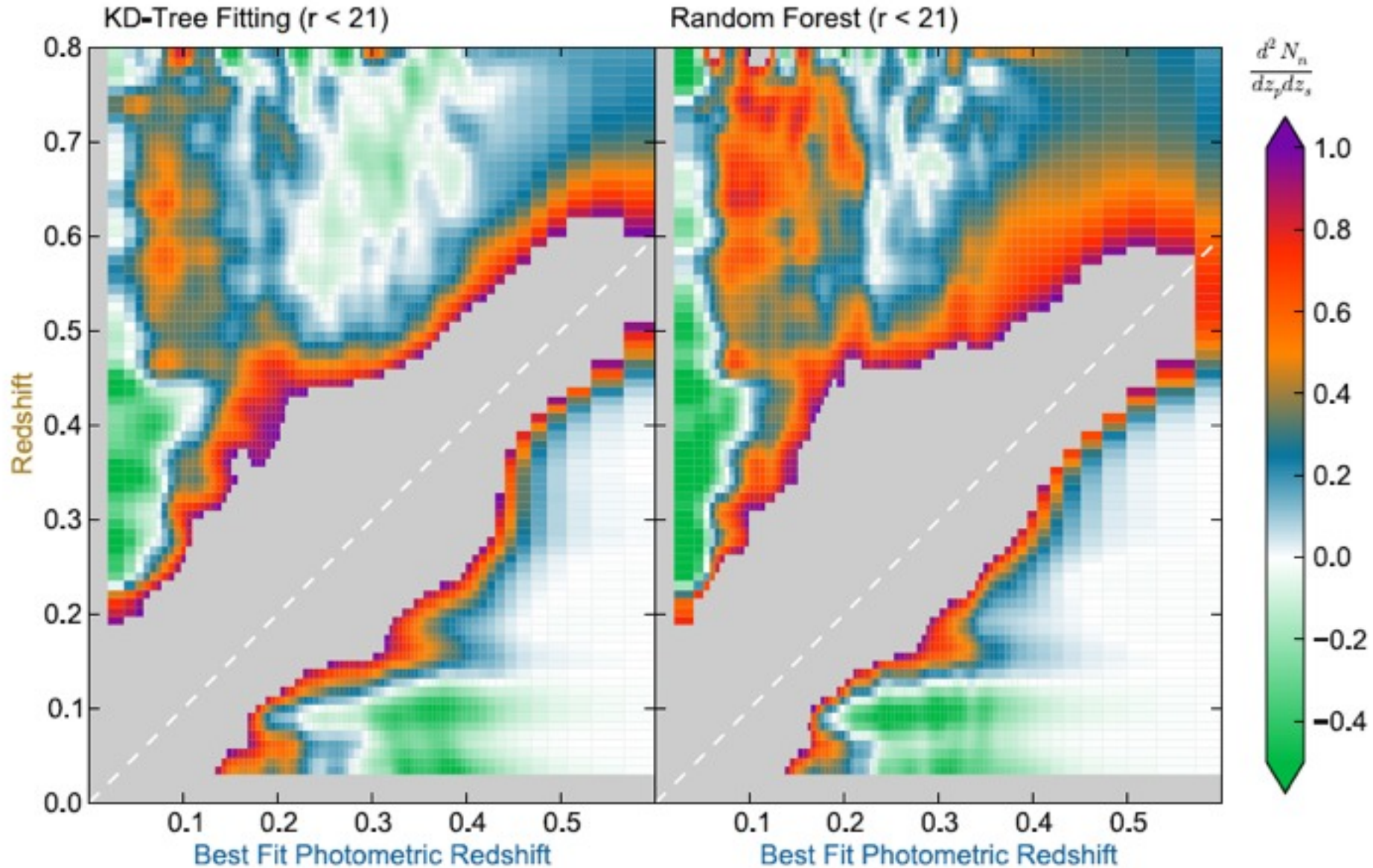
# Global redshift distribution



# Global redshift distributions inferred from photo-zs and cluster-zs

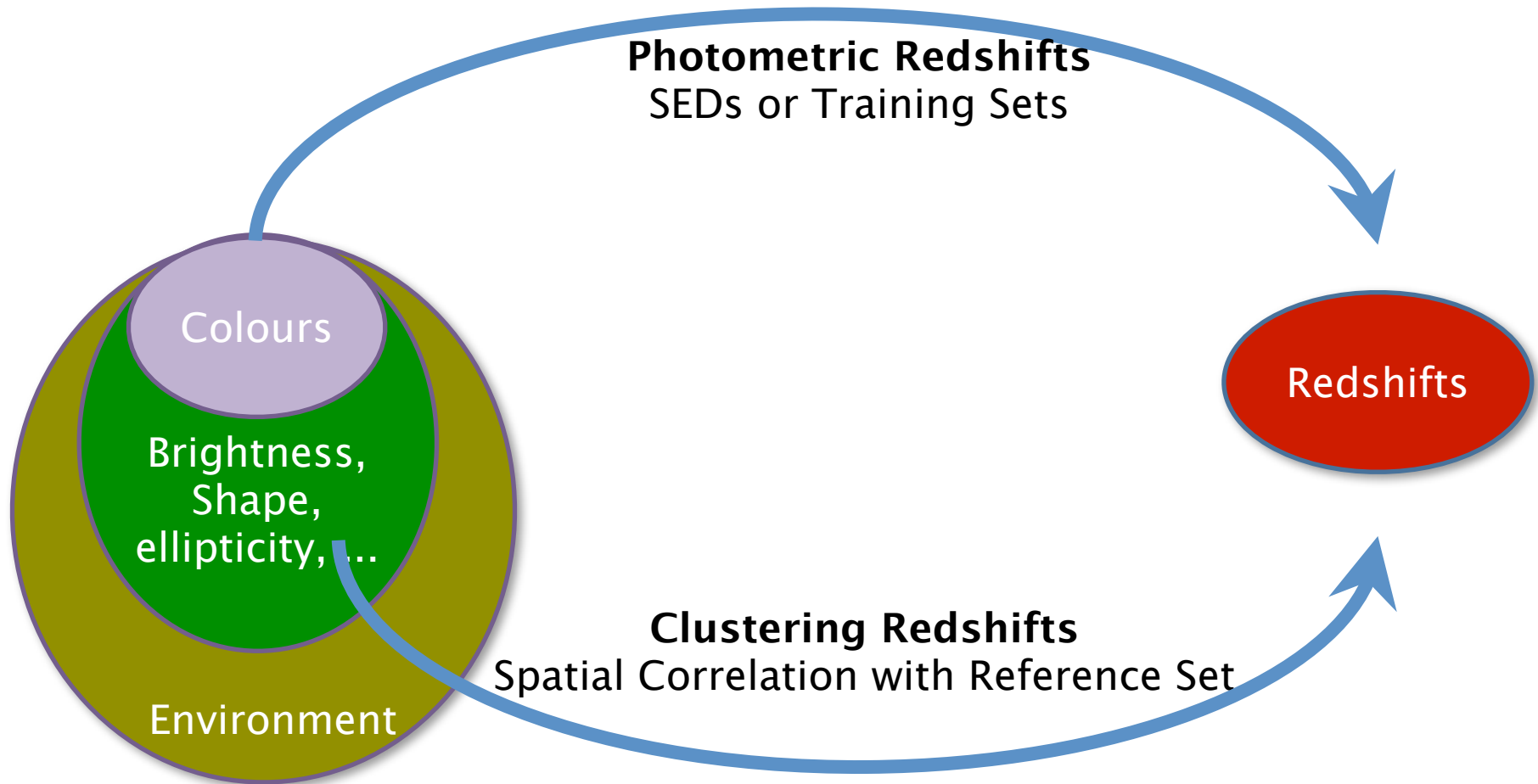


# Comparing different photo-z methods



What's next?





- multidimensional sampling/selection

This will be done without any reference to photo-zs

**This can be used to infer the redshift pdf of one galaxy**

# Summary

- Spatial correlations give us an estimate of  $b(z) \cdot dN/dz$
- This can be used as a tool to explore the 3<sup>rd</sup> dimension of the Universe.
- This method can process *any* dataset:
  - ★ does not require any spectral feature
  - ★ can even be done with one band
  - ★ can be applied to diffuse signals
- Interesting preliminary results. More to come soon...

