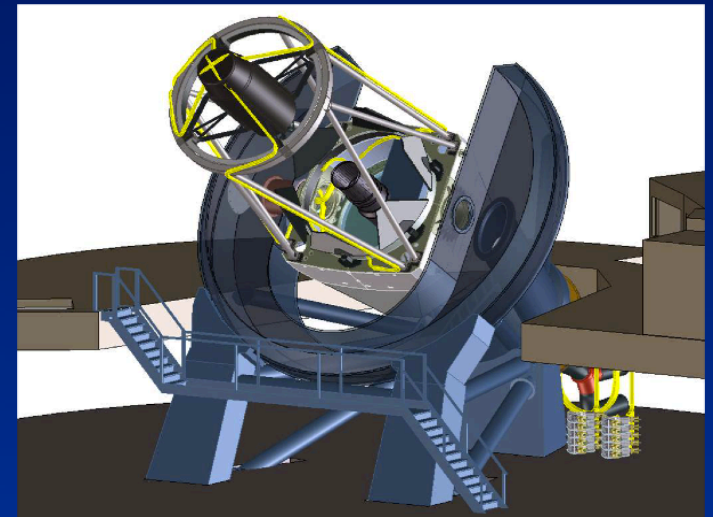
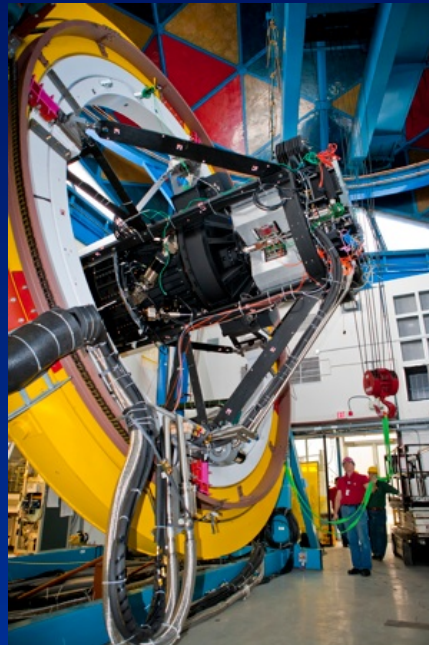
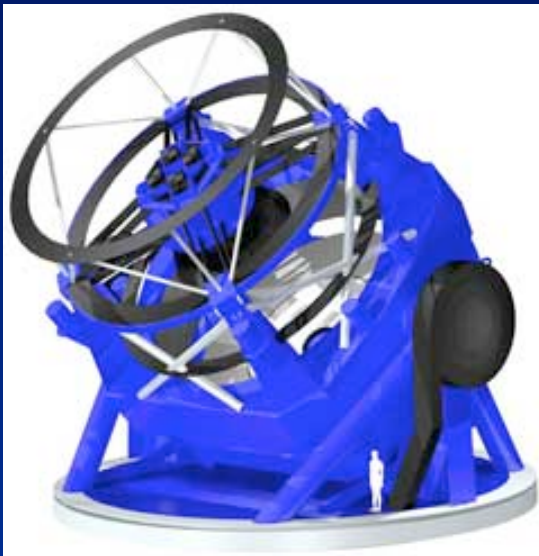


# Photometric Redshift Calibration with Wide-Area Surveys



Jeffrey Newman

University of Pittsburgh  
Pitt-PACC



# Outline

- I. Photo- $z$  calibration lessons learned from existing deep spectroscopic surveys
  - Expected error rates of "secure" redshifts exceed calibration requirements
  - Existing samples to  $i \sim 22.5$ -23 are systematically incomplete at the 30-70% level
- II. Required exposure time to get  $\sim 90\%$  completeness to  $i \sim 23$ :  $\sim 32$  hours with Keck,  $\sim 25$  nights with DESpec.
  - 6x longer to reach DES limit ( $i \sim 24$ )
- III. A promising alternative: wide-area spectroscopic surveys utilizing cross-correlation techniques

# Calibrating photo- $z$ 's is a difficult problem

- Requirement for training set/machine-learning/weighting techniques: a large spectroscopic sample with well-understood sampling of the full range of properties of photo- $z$  targets
- For template-based approaches, need spectroscopic training samples that span full range of real galaxy SEDs. Still need to go faint (smaller galaxies begin star formation later).
- Problem for Stage IV experiments: planned targets are too dim to get spectroscopic redshifts for *en masse*
- Problem for Stage III experiments: Existing deep spectroscopic survey samples from 8-10m telescopes are **far** from complete, and have unacceptably high error rates even for "secure"  $z$ 's

# Redshift error rates that are acceptable for galaxy evolution studies are not for DE

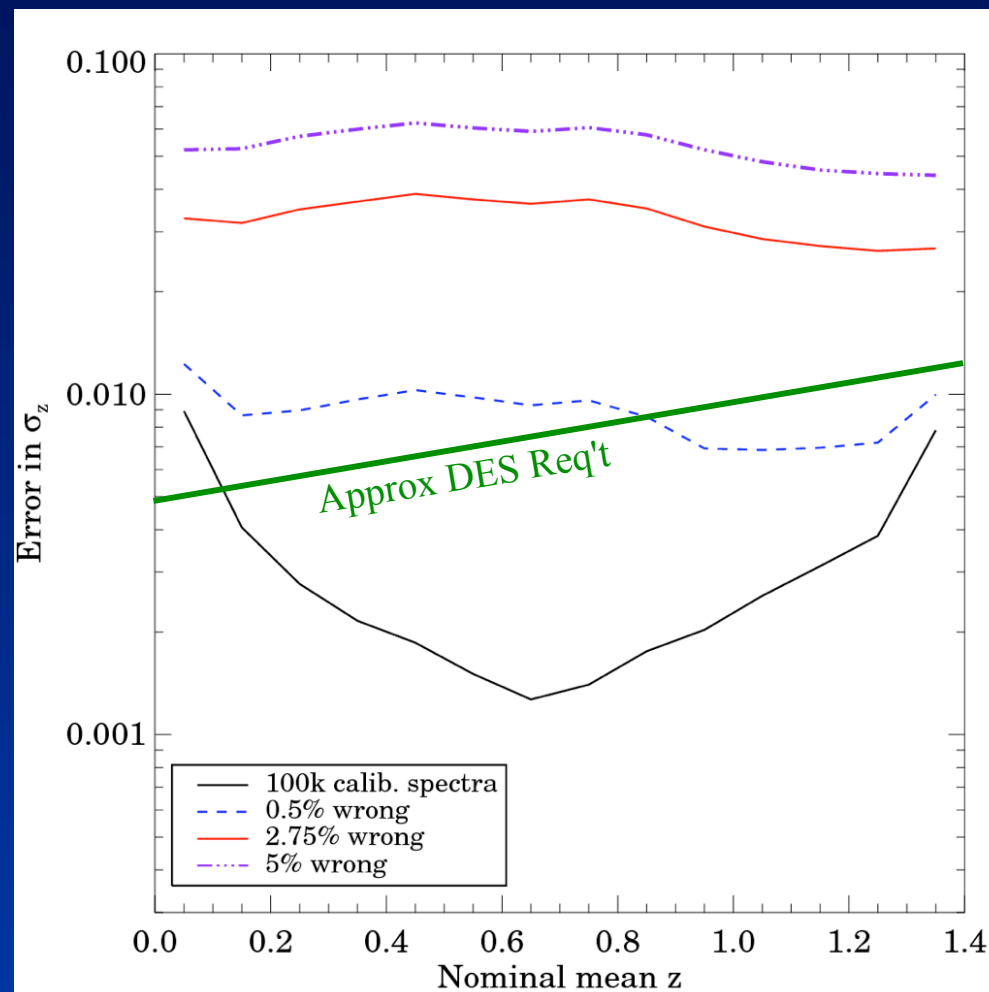
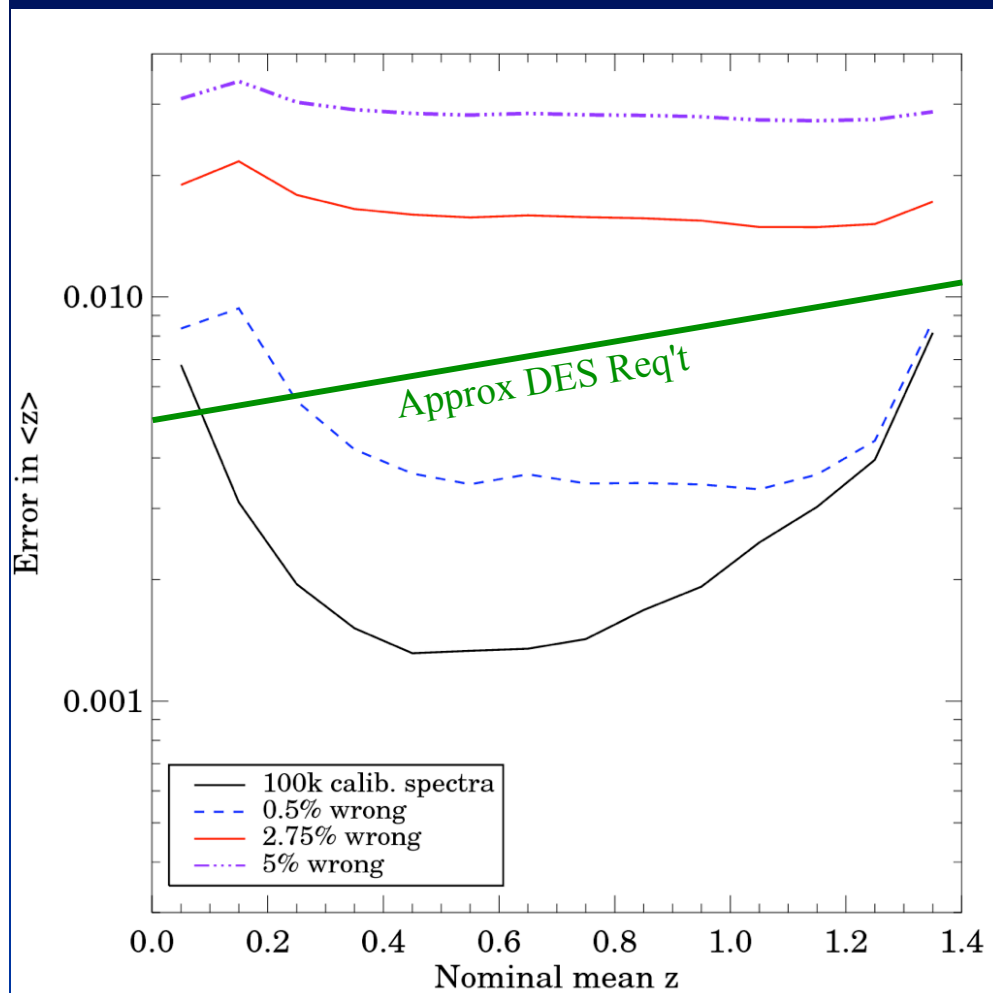
VVDS, zCOSMOS, and DEEP2 all use 'flag' or 'Q' =3 to indicate redshifts with >95% confidence, flag/Q=4 for >99.5% (actual failure rates shouldn't match confidences exactly)

Flag = 3 redshifts are ~50% of VVDS/zCOSMOS "secure" measurements (17% for DEEP2).

## What impact will incorrect/outlier redshifts have on photo-z calibration errors?

- Consider an ideal calibration sample: a 100% complete set of redshifts of 100k galaxies, perfectly tracing the redshift/property distributions of the photometric sample (here: DES)
- Model: incorrect redshifts are off by a number drawn from a skew Gaussian with mode=0.5 and  $\sigma = 0.5$

# Even with 100% complete samples, current false-z rates would compromise DE inference



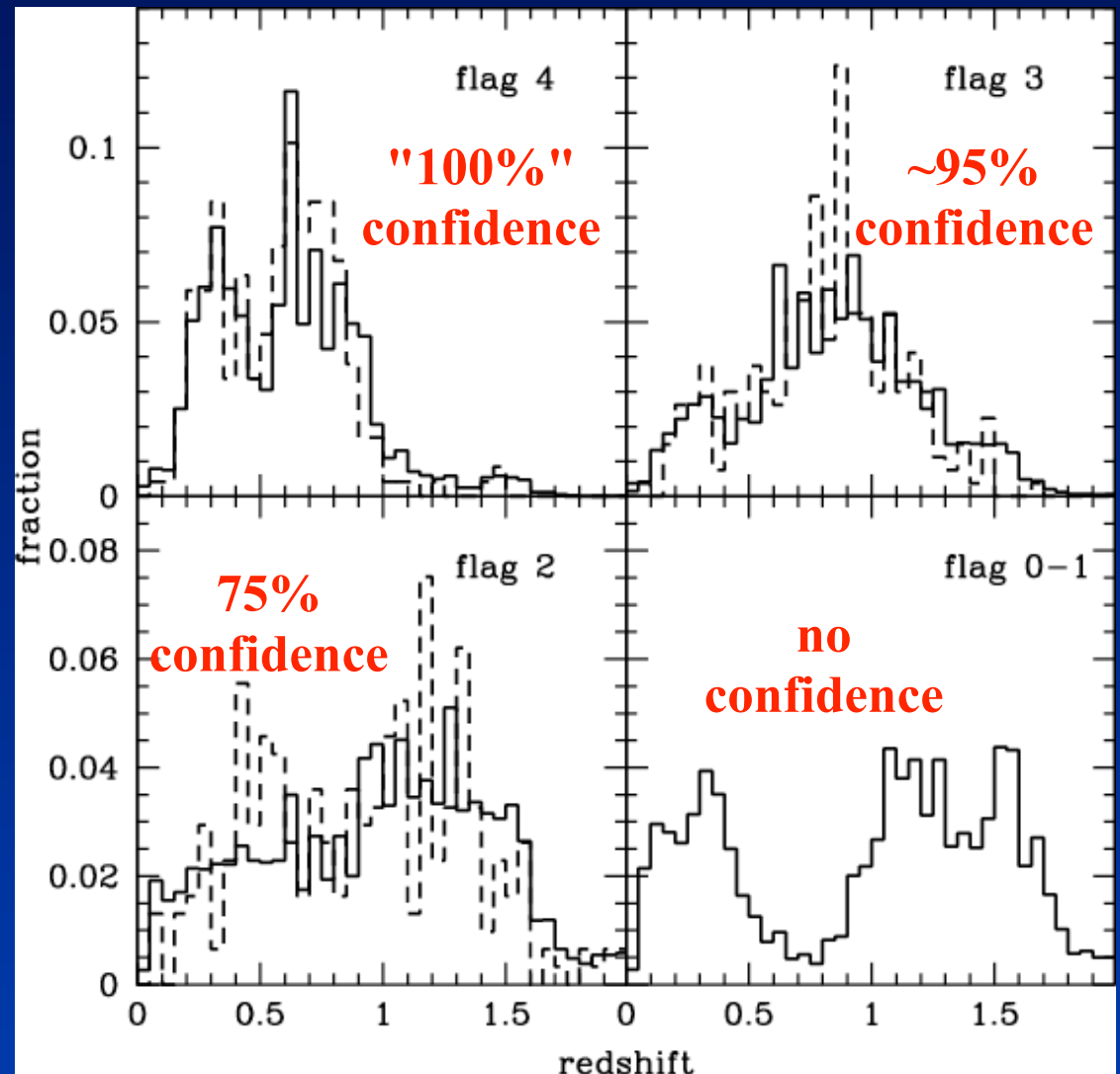
Based on actual redshift distributions for ANNz-defined DES bins in mock catalog from Huan Lin, UCL & U Chicago, provided by Jim Annis

# Existing redshift surveys are highly and systematically incomplete; e.g. VVDS...

**VVDS-wide:**  $i < 22.5$   
survey at VLT

- Almost all galaxies at  $z > 1$  have lower-confidence redshifts.

- Success rate is a function of photo- $z$ ; success rate is 21% if flag 4 is required, 42% if flag 3 (~95% correct) are acceptable

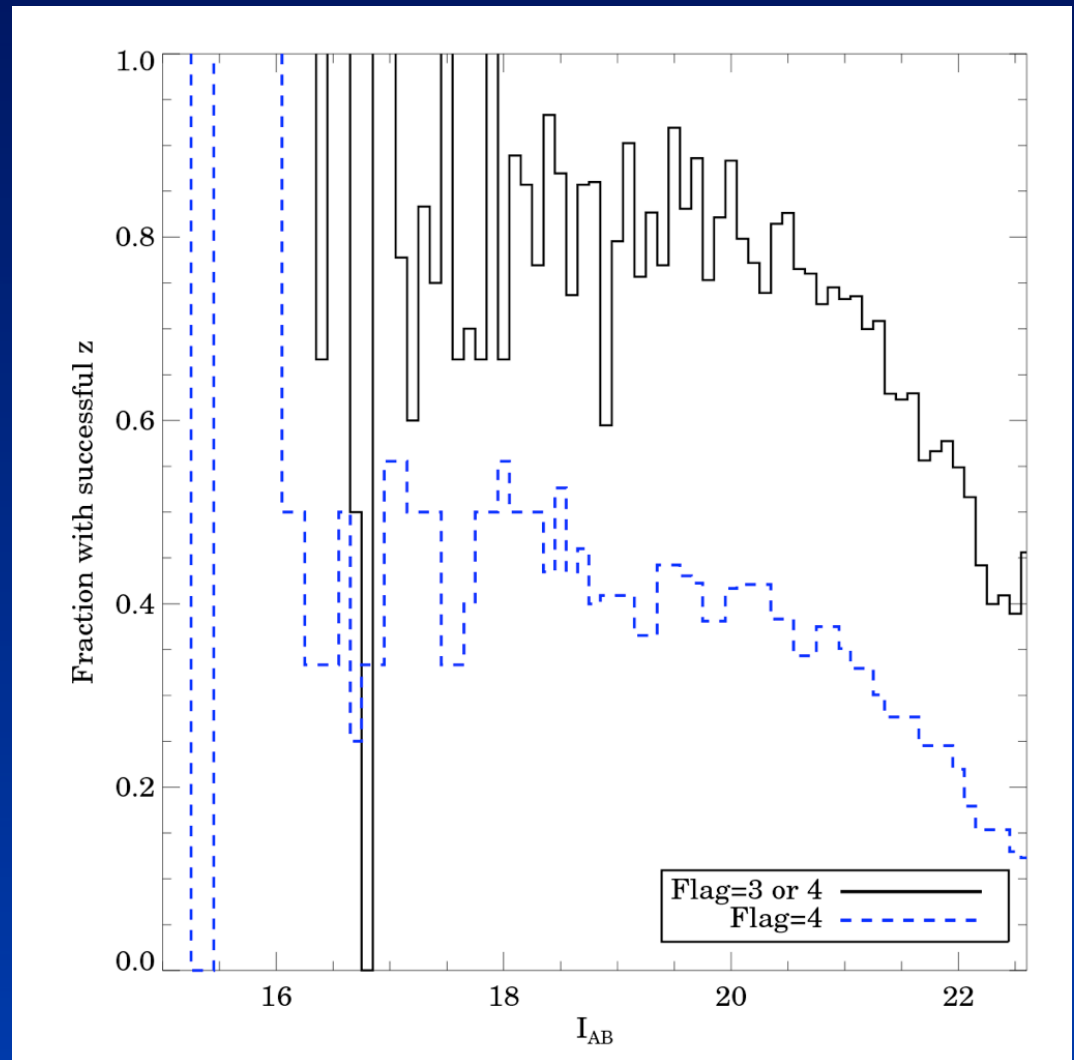




# zCOSMOS does somewhat better, but $z$ success falls off past $i=20$

**zCOSMOS-bright:**  $i < 22.5$   
survey at VLT

- Redshift success is a strong function of magnitude.
- 59% redshift success rate for galaxies if count flag 3+4 (>95% confidence), 26% if require flag 4 (>99.5% confidence).
- Very few secure redshifts at  $z > 1$



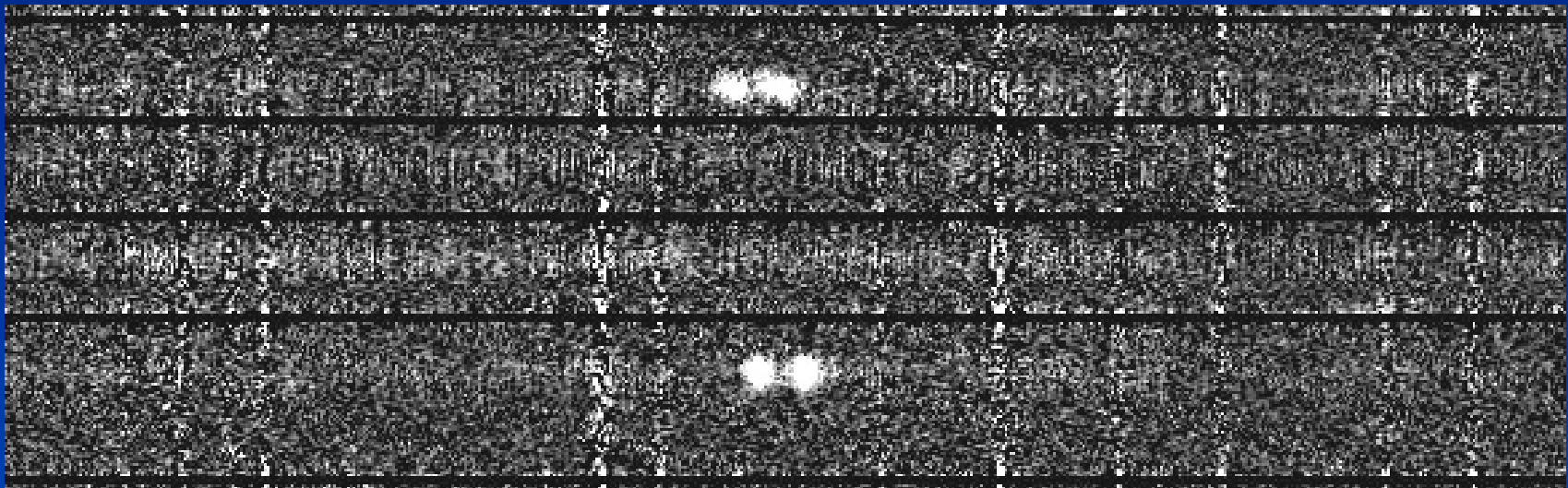
**DEEP2 obtained the highest redshift success rate amongst the large deep surveys: 73%**

**DEEP2:**  $R_{AB} < 24.1$  survey at Keck, focused on  $0.7 < z < 1.4$

DEEP2 has 2 categories of redshift quality considered successful (totalling  $\sim 73\%$  of targeted galaxies):

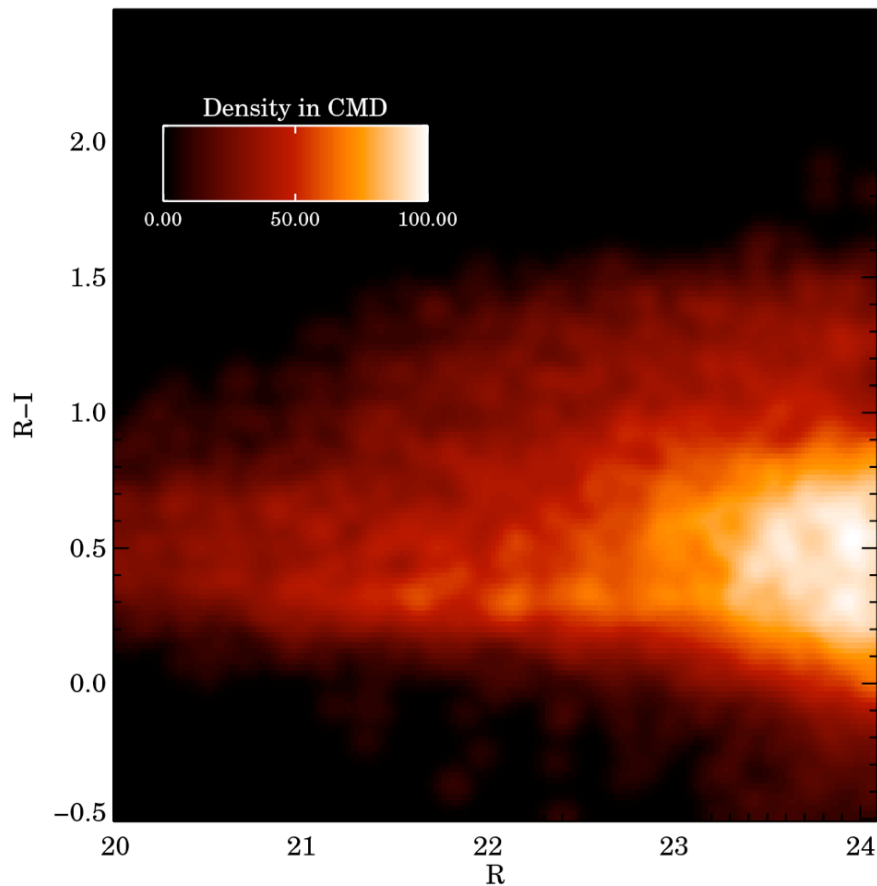
**Q = 3:** 17% of successes;  $>98.4\%$  correct (based on 2614 objects with repeated observations)

**Q = 4:** 83% of successes;  $>99.7\%$  correct (ditto)

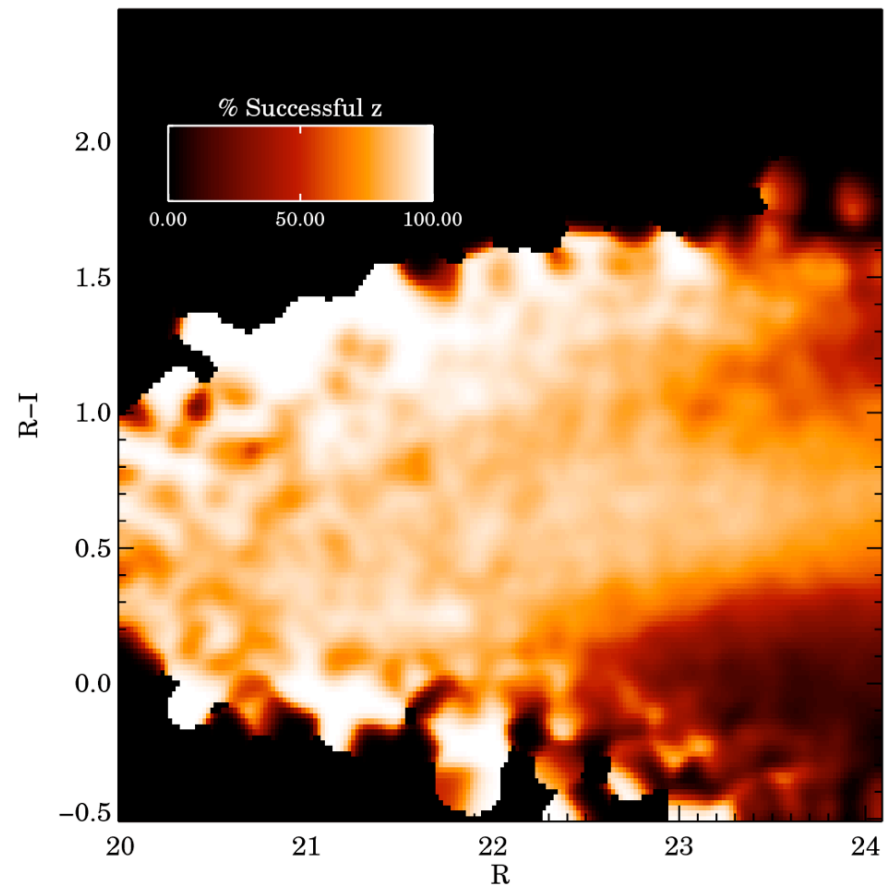




# Redshift success rate depends on both color and magnitude



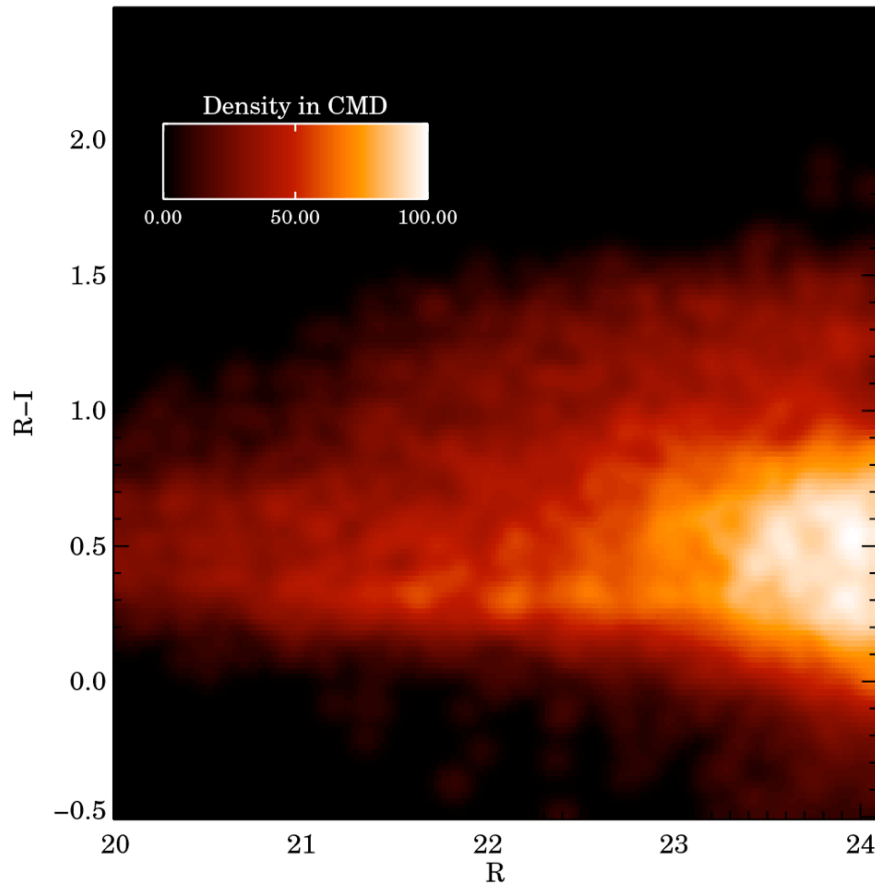
**Observed Color-Magnitude diagram for DEEP2 targets (in EGS, so no color cut)**



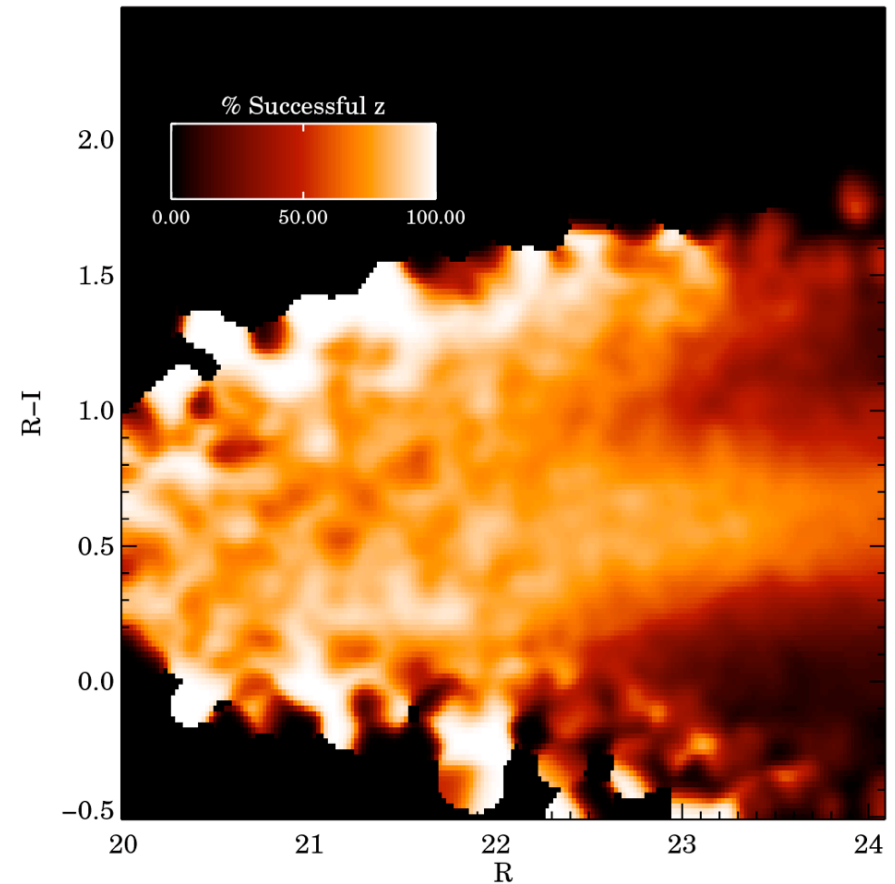
**Redshift success (Q=3 or 4) rate**

**Newman et al. 2012**

# Redshift success rate depends on both color and magnitude



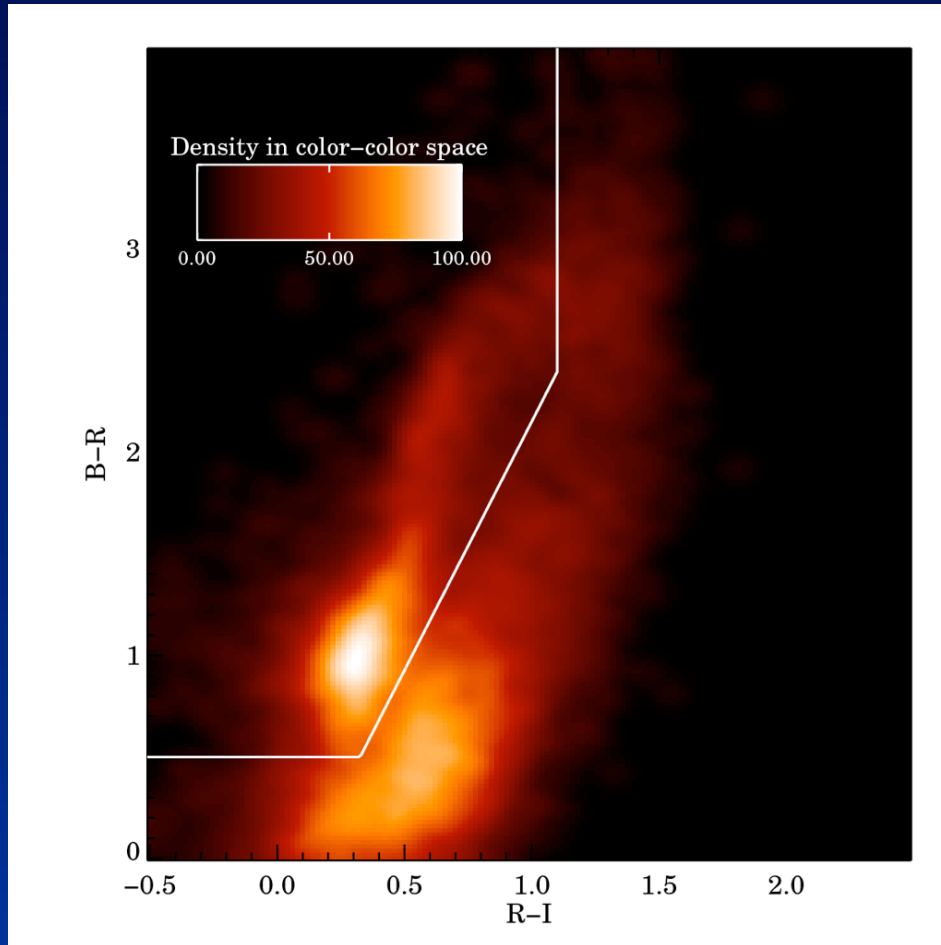
Observed Color-Magnitude diagram for DEEP2 targets (in EGS, so no color cut)



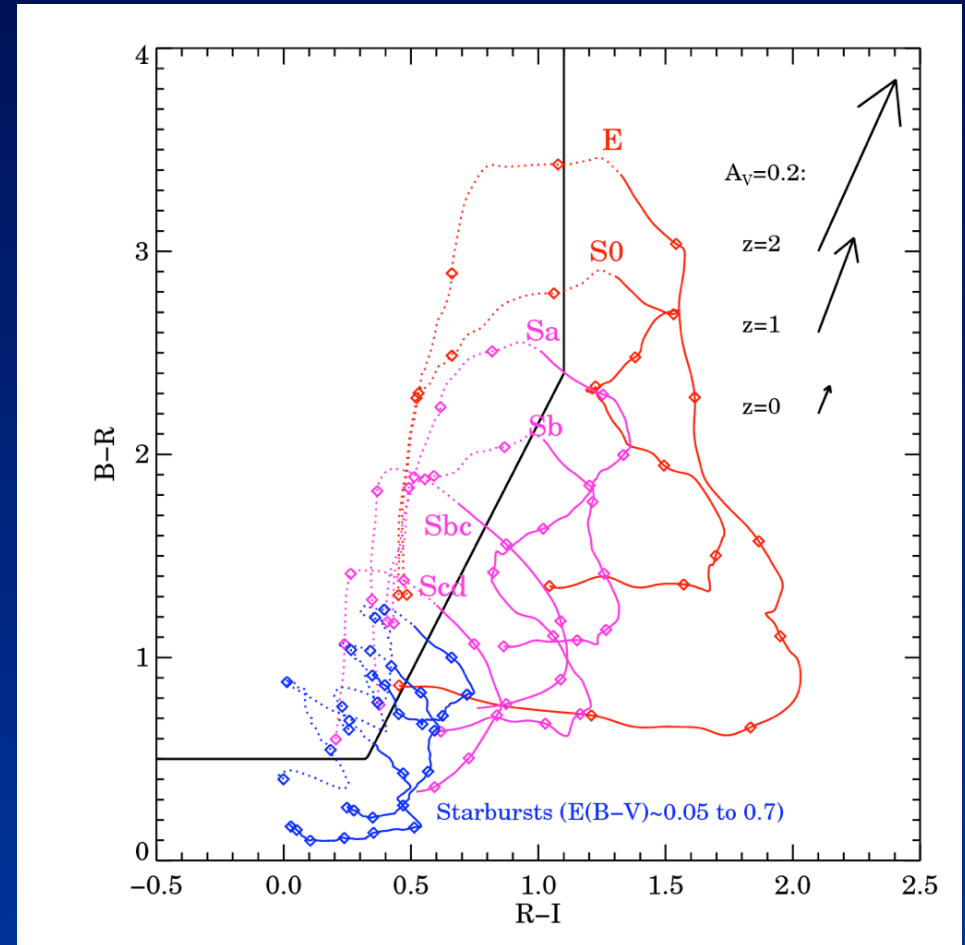
Redshift success (Q=4 ONLY) rate

Newman et al. 2012

# Redshift Success in DEEP2 color-color diagrams

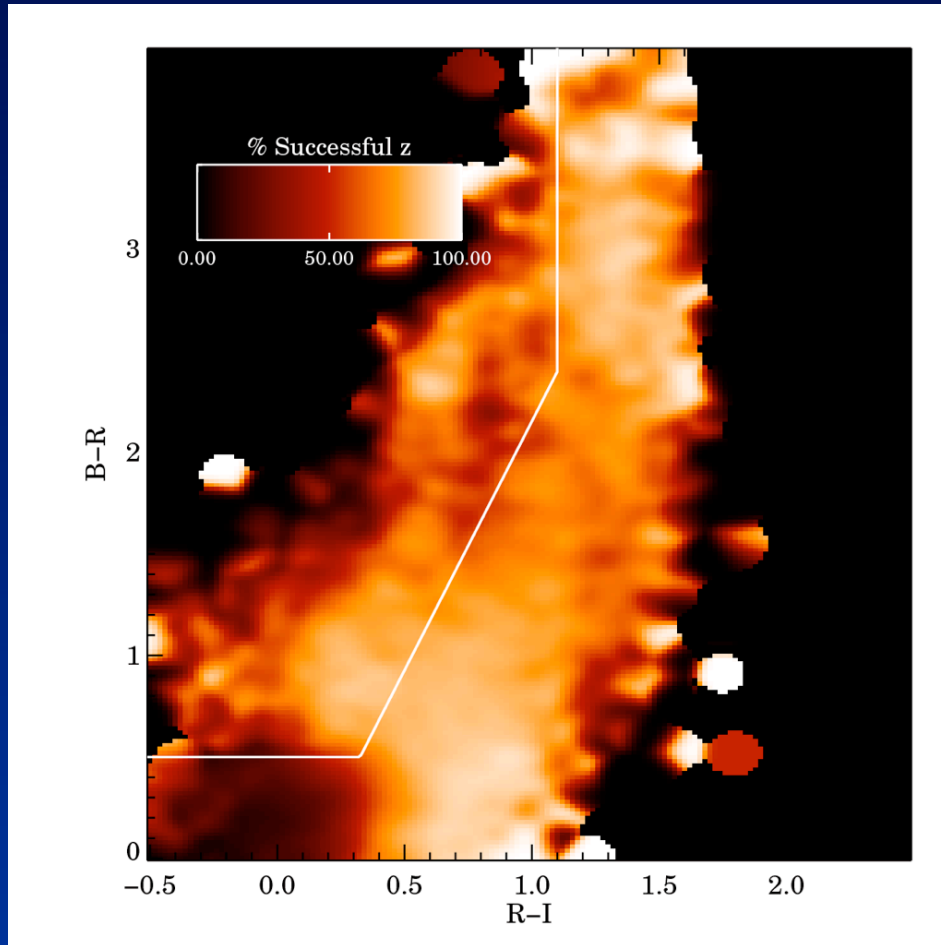


Observed color-color diagram for DEEP2 targets (in EGS, so no color cut)

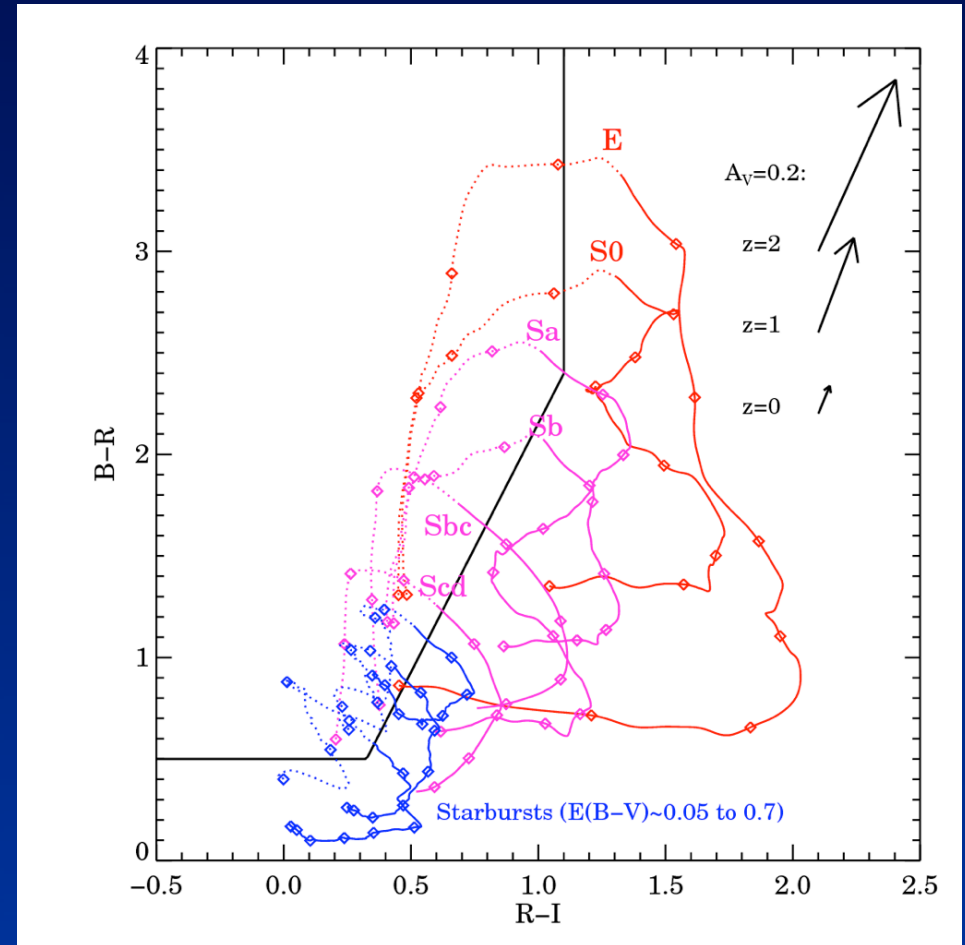


CWW tracks through CMD (dot-solid transition at  $z=0.7$ , diamonds every 0.2 in  $z$ )

# Redshift Success in DEEP2 color-color diagrams



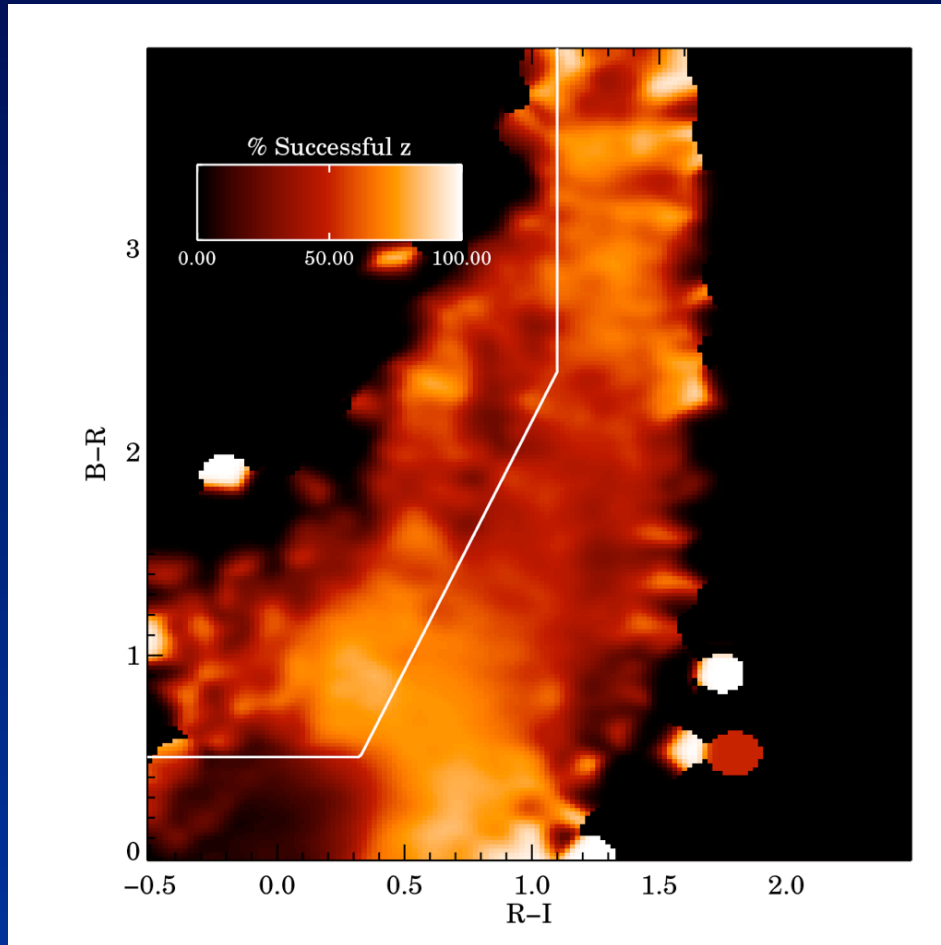
Success ( $Q=3$  or 4) rate for  
DEEP2;  $<90\%$  in best  
regions



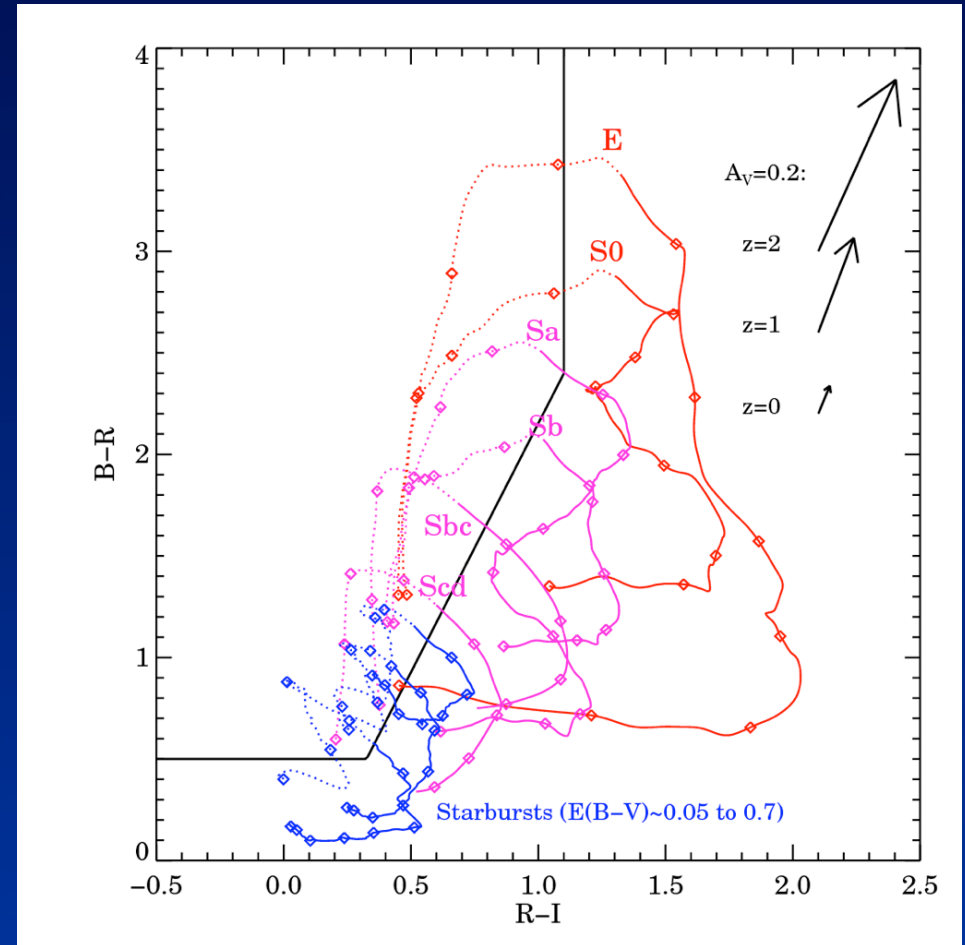
CWW tracks through CMD

Newman et al. 2012

# Redshift Success in DEEP2 color-color diagrams



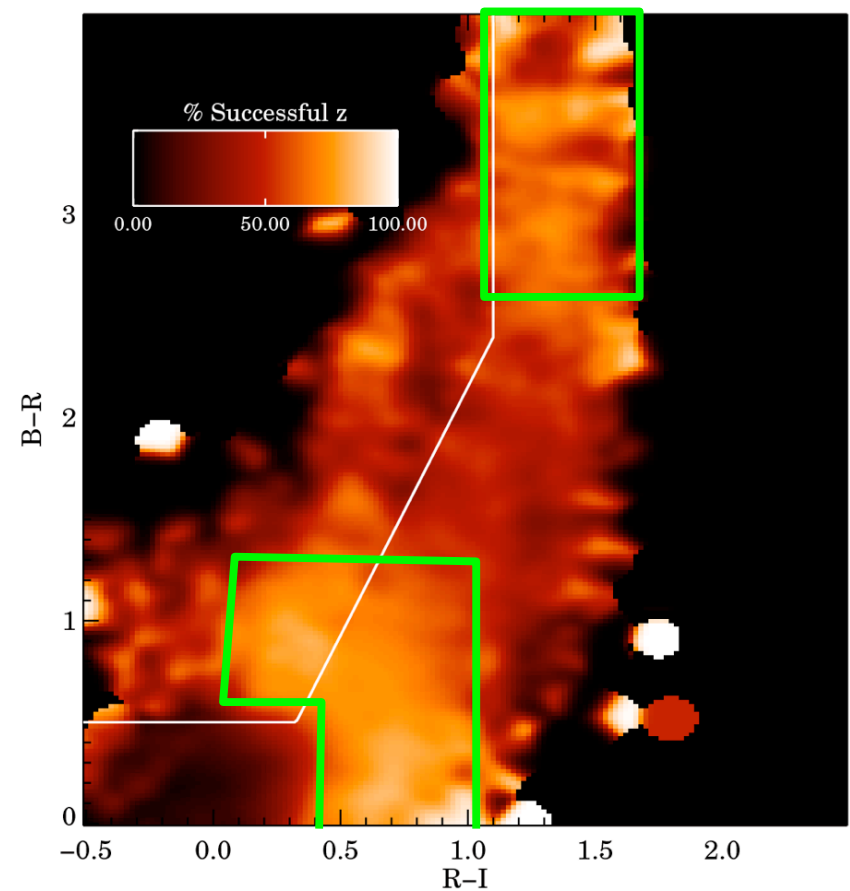
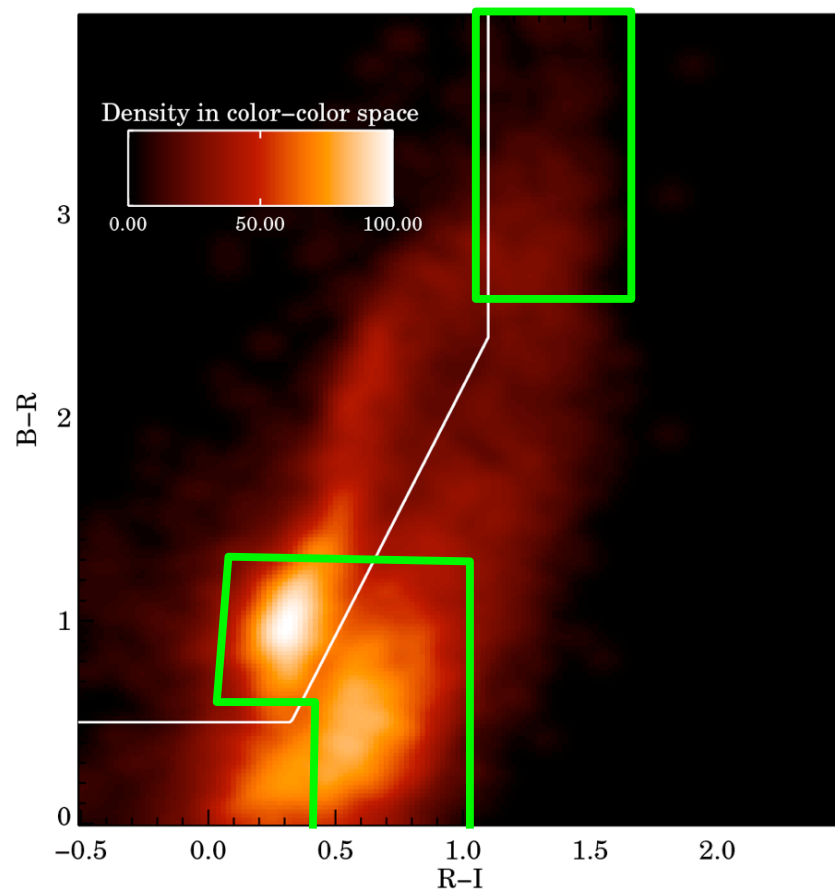
Success (Q=4 ONLY) rate  
for DEEP2; <80% in best  
regions



CWW tracks through CMD

Newman et al. 2012

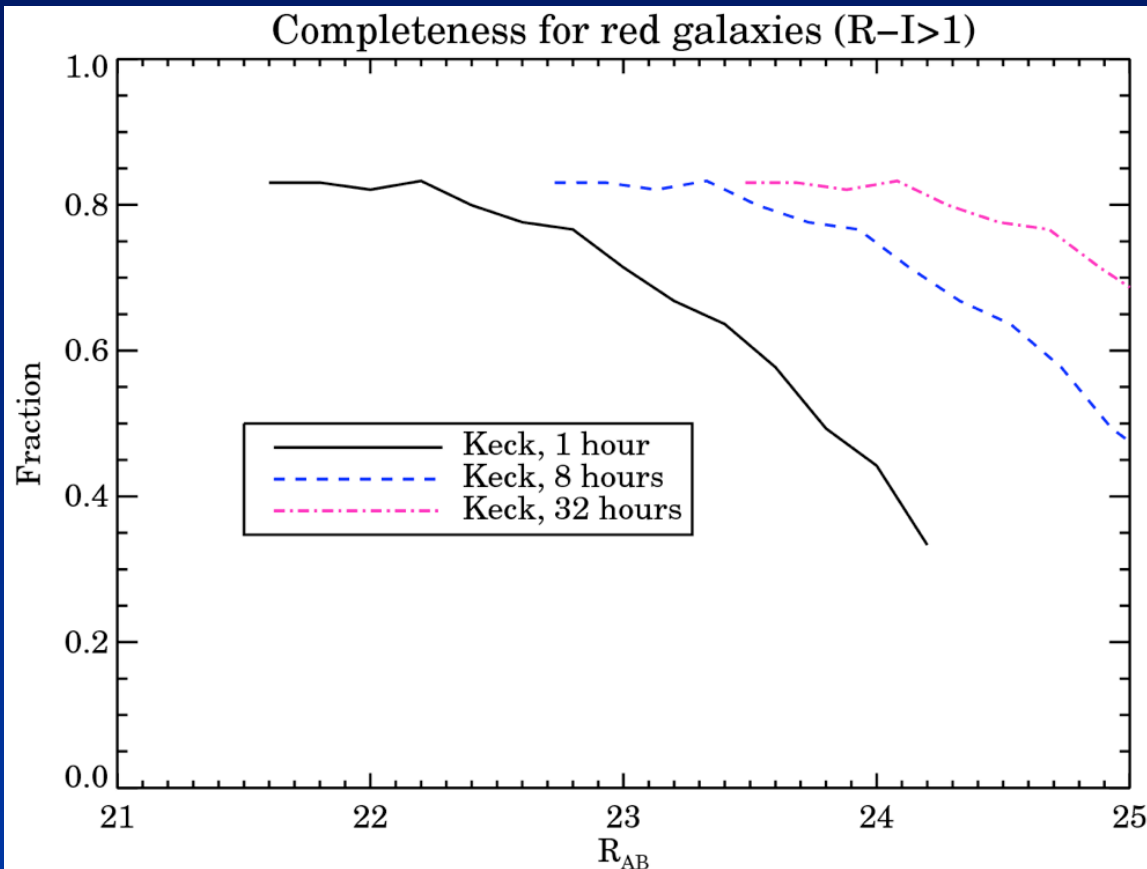
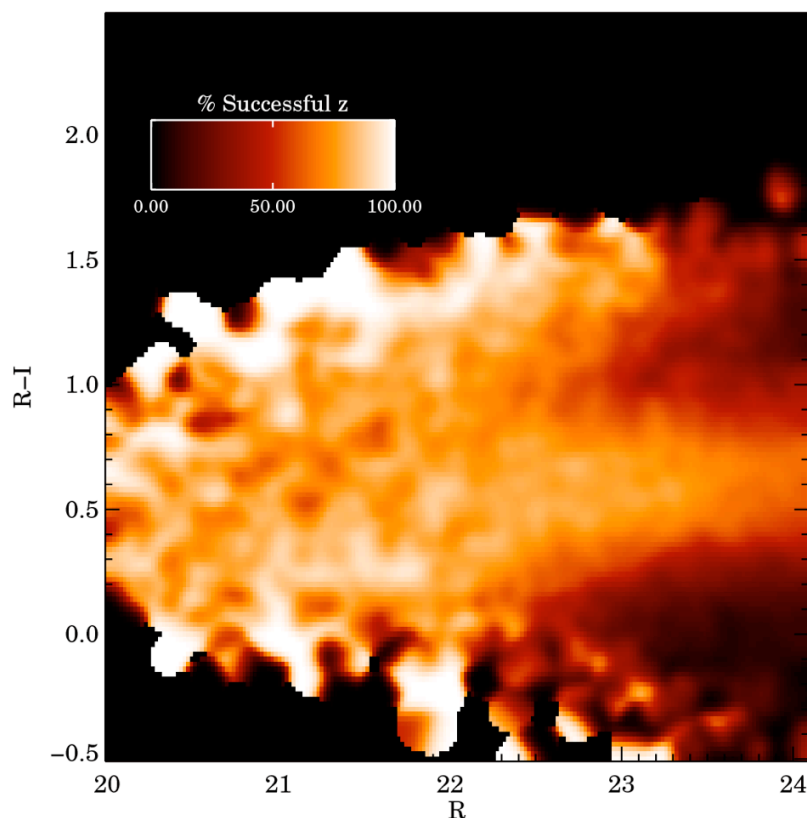
# Restricting to ‘good’ parts of color space bears significant cost - and still has substantial failure rate



The regions with ‘good’ redshift success contain  $\sim 60\%$  of  $R_{AB} < 24.1$  objects.

32 Keck hours/spectrum is required to get good completeness for red galaxies to  $r=24.1$  ( $i\sim 23$ )

- $\approx$  **25 NIGHTS** with DESpec
- Achieving that completeness to  $i=24$  would take  $>6\times$  longer!

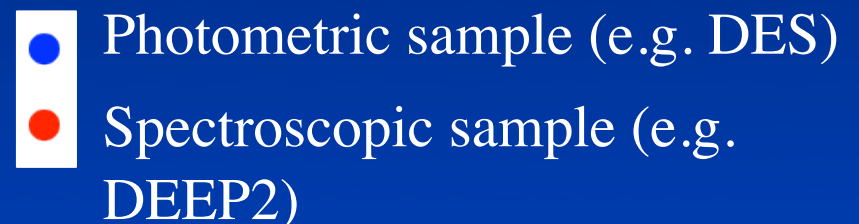
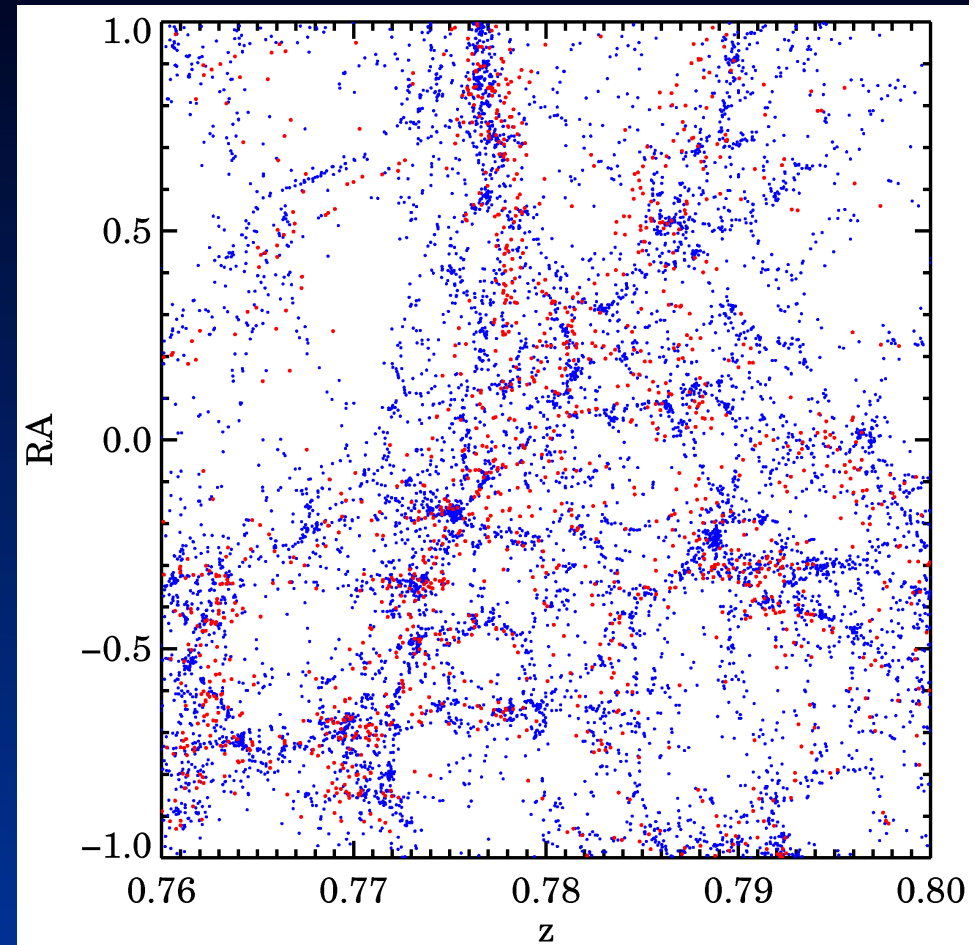


DES should not assume that full training sets will be available for machine-learning/weighting photo-z methods !!!



# Cross-correlation methods: exploiting redshift information from galaxy clustering

- Galaxies of all types cluster together: trace same dark matter distribution
- Galaxies at significantly different redshifts do not cluster together
- From observed clustering of objects in one sample with another (as well as information from their autocorrelations), can determine fraction of objects in overlapping redshift range



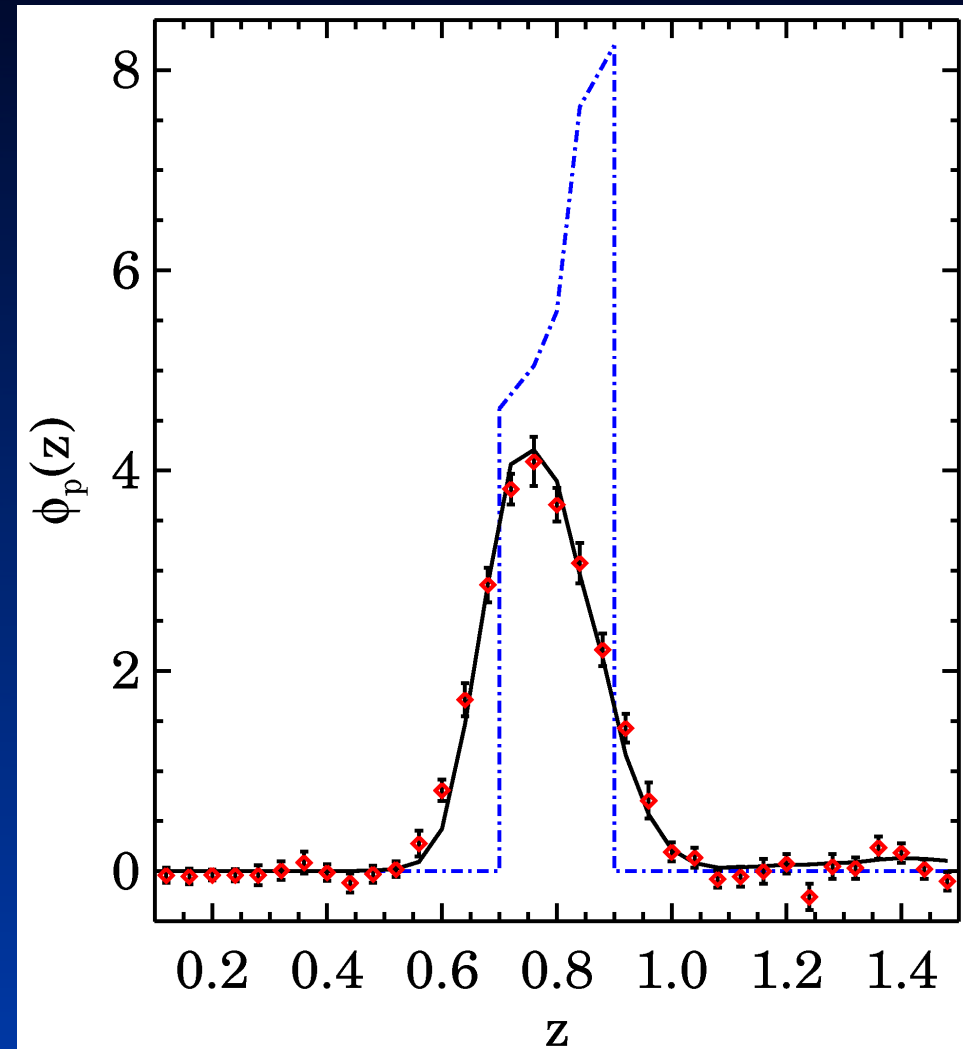
# Detailed redshift distribution can be obtained by cross-correlating with spectroscopic samples

- Key advantage: spectroscopic sample can be systematically incomplete and include only bright galaxies
- See: **Newman 2008, Ho et al. 2008, Matthews & Newman 2010, 2012**

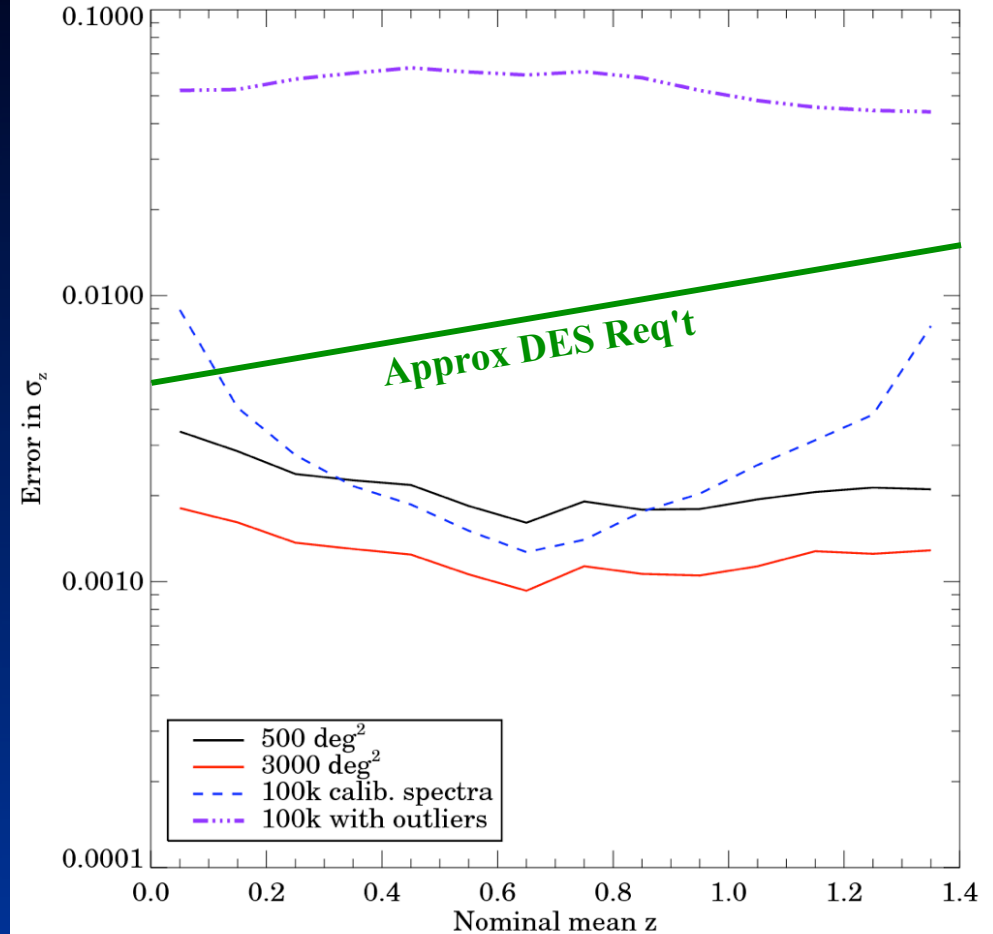
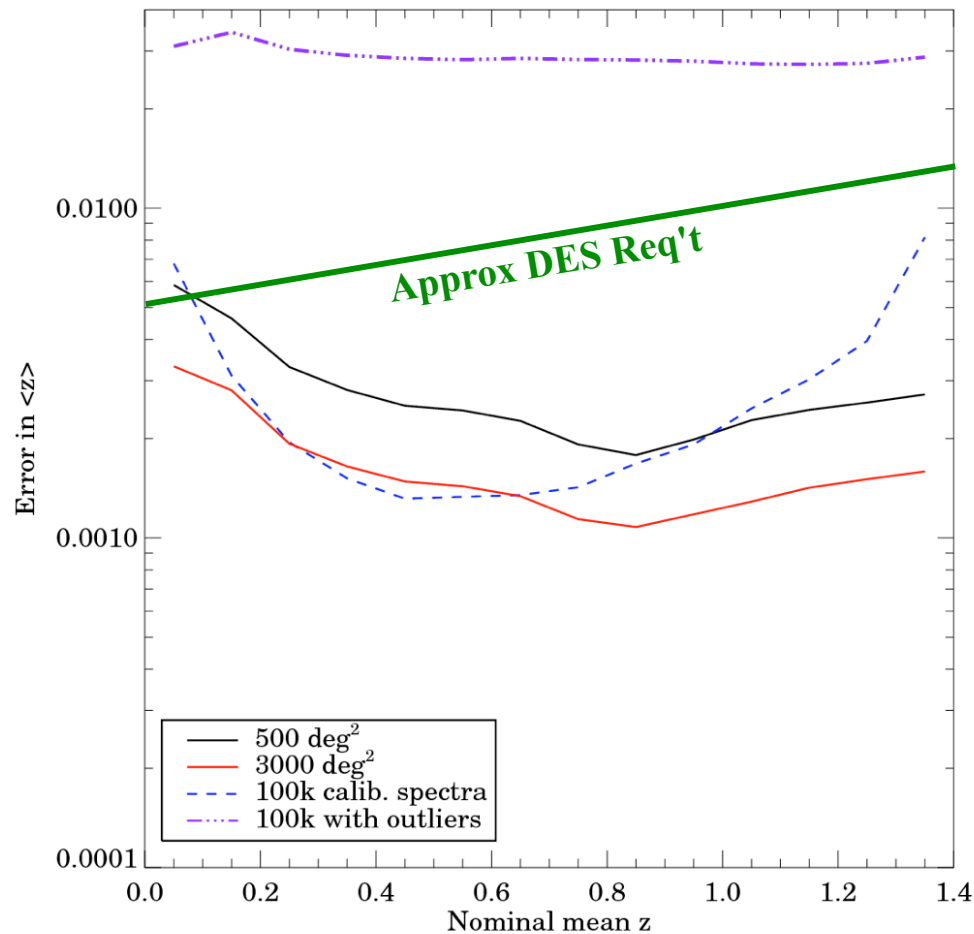
Blue:  $z_{\text{phot}}$  distribution of objects with  $0.7 < z_{\text{phot}} < 0.9$

Black: True  $z$  distribution of sample, spanning 24 widely-separated fields

Red: Cross-correlation reconstruction with only a  $R < 24$ ,  $4 \text{ deg}^2$  survey



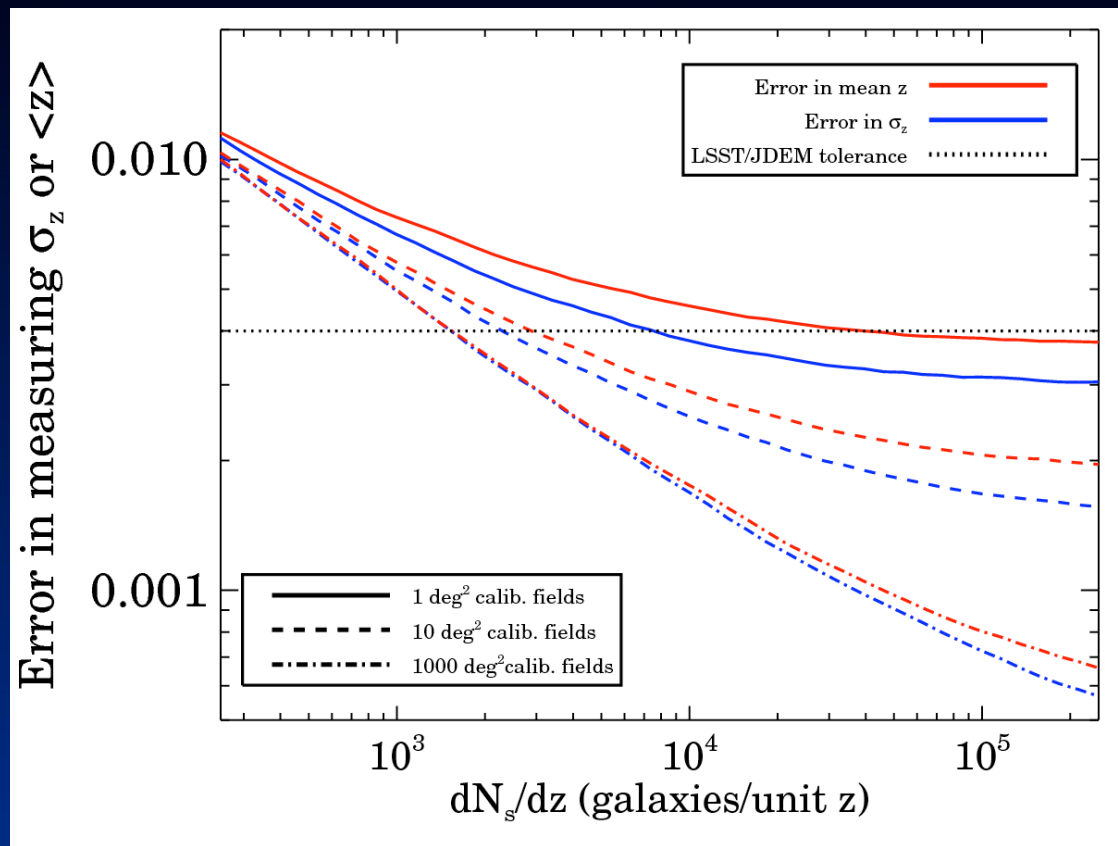
# Cross-correlation methods can outperform even ideal conventional calibration samples



Plots from BigBOSS-DES WG report (Weinberg et al. 2012). 500 or 3000 deg<sup>2</sup> of BigBOSS overlap vs. 100% complete sample of 100k spectra following DES  $z$  distribution

# Spectroscopic requirements for cross-correlation methods

- Error model tested with Millennium mock catalogs
- Example: spectra are obtained in 4 fields, and used to characterize a photo-z bin at  $z=1$  with  $\sigma_z = 0.05$  and  $\Sigma = 10$  objects/arcmin<sup>2</sup> (errors scale roughly as  $\sigma_z^{1.4} \Sigma^{-0.5}$ )



- For areas  $>$  few deg<sup>2</sup>, few tens of thousands of spectra per unit  $z$  are required to calibrate LSST
- Wider surveys with more spectra will allow us to do even better (e.g. characterize  $z$  distribution for smaller samples)

# Conclusions

- Current/ongoing deep data sets are not sufficient to calibrate Stage III/IV programs with conventional techniques:
  - Failure rates 10% at best,  $>50\%$  at fainter end of DES
  - Incorrect "successful"  $z$ 's cause unacceptable calibration errors
  - Extremely long exposures needed to get  $\sim 10\%$  failure rate at  $i=24$
  - These are especially large problems for training-set/machine-learning based photo- $z$  methods!
- Using cross-correlation techniques, reasonably-sized, “easy”-to-obtain spectroscopic datasets can determine redshift distributions for photometric samples with precision sufficient for DES or LSST. For DES,  $\sim 1000 \text{ deg}^2$  overlap with eBOSS may be sufficient.
- Larger samples covering wider areas are especially valuable - DESpec or BigBOSS!
- See Newman 2008 and Matthews & Newman 2010, 2012 for details and recipes; DEEP2 DR4 at <http://deep.berkeley.edu/DR4>

# DEEP2 Redshift Quality vs. magnitude

