



KAVLI INSTITUTE FOR PARTICLE ASTROPHYSICS AND COSMOLOGY

Angular and redshift issues for large galaxy surveys

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Stanford University

TAUP 2013

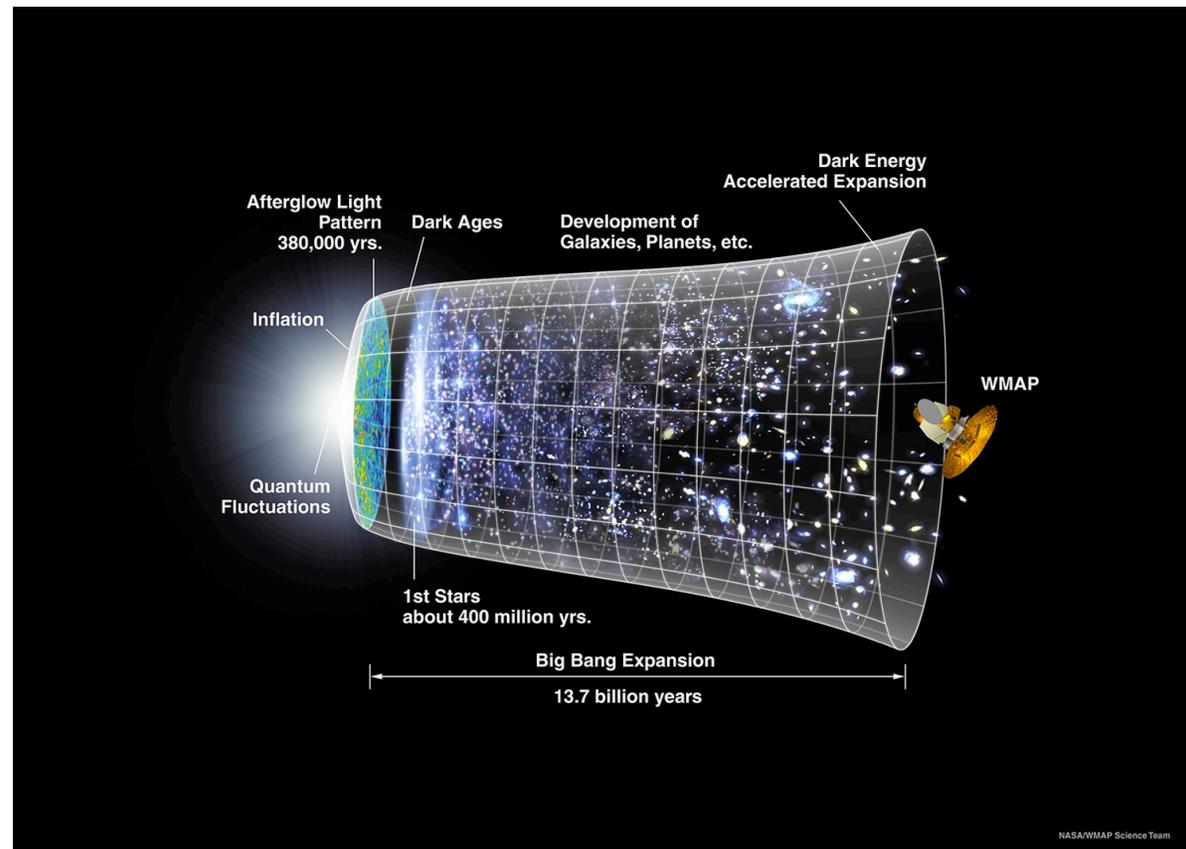
Asilomar, CA – September 10, 2013

Cosmological information

Cosmological information comes from two sources:

Geometry: tracing the expansion history

Growth of large-scale density fluctuations



Cosmological probes from large galaxy surveys

- Supernovae
- Gravitational Lensing
- Large-scale structure (BAO)
- Galaxy Clusters

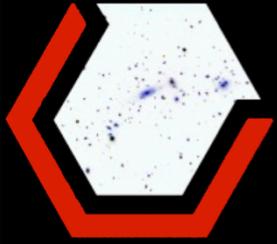
Ongoing and upcoming optical surveys

Photometric:

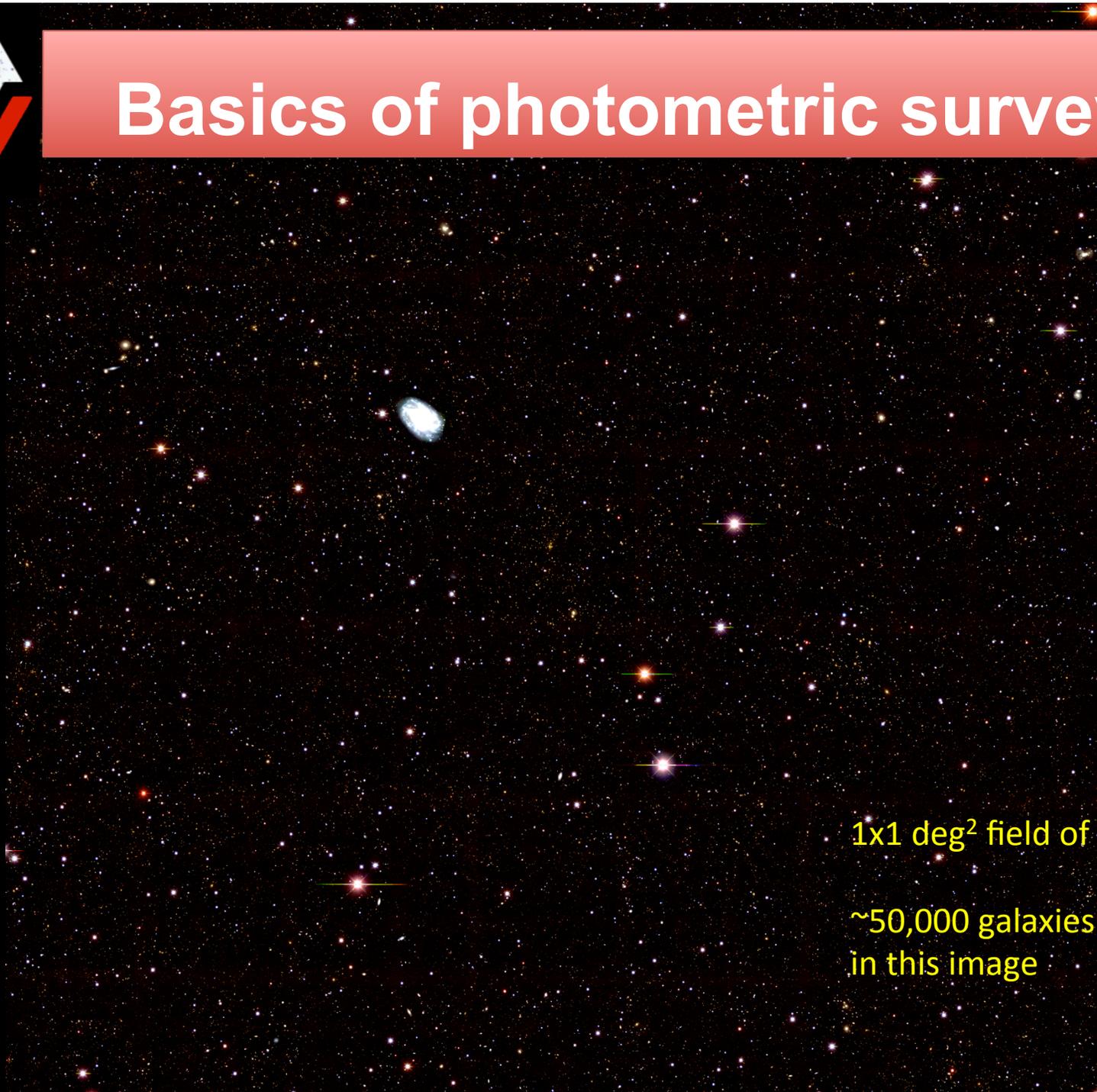
- **DES:** Dark Energy Survey
- **PanStarrs:** Panoramic Telescope and Rapid Response System
- **KIDS:** Kilo-Degree Survey
- **HSC:** HyperSuprime Cam
- **LSST:** Large Scale Synoptic Telescope

Spectroscopic:

- **BOSS:** Baryon Oscillation Spectroscopic Survey
- **MS-DESI:** Mid-Scale Dark Energy Spectroscopic Instrument



Basics of photometric surveys

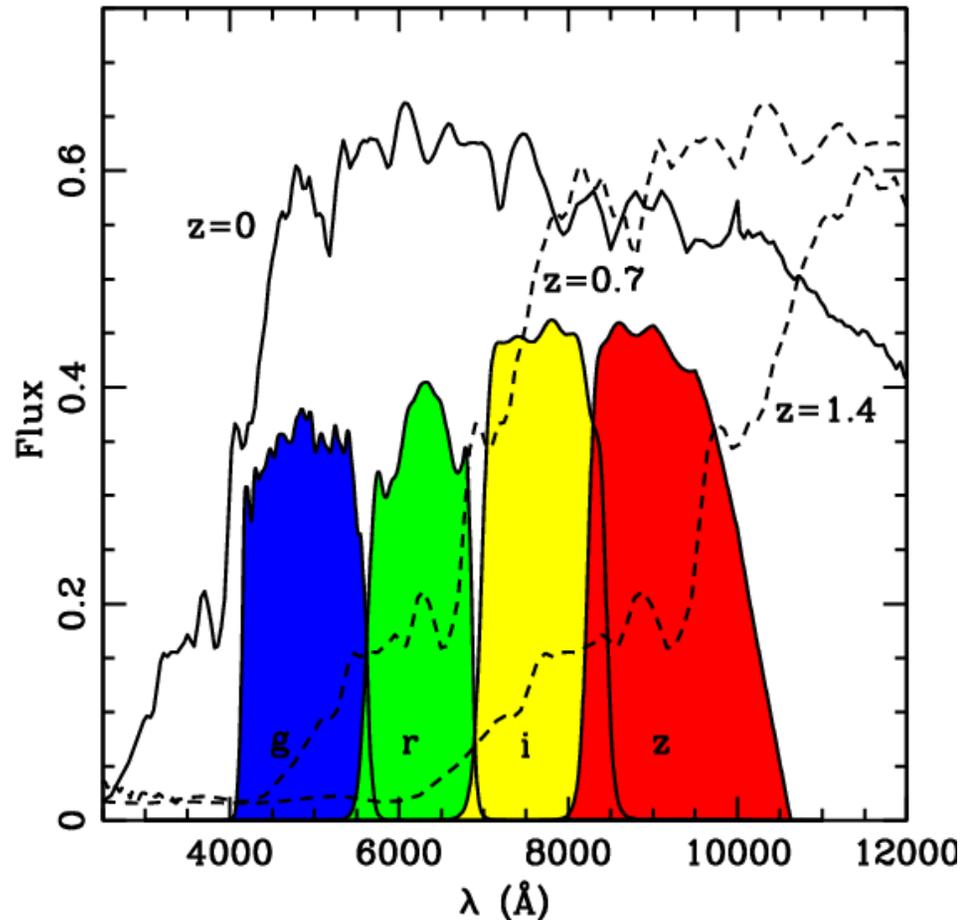


1x1 deg² field of view

~50,000 galaxies
in this image

Basics of photometric surveys

- Collect light from galaxies in several broad-band filters in optical and near-IR.
- E.g. grizY (DES) + JK (Vista)
- Use flux in each filter to determine:
 - type:star/gal./QSO
 - gal. type: spiral, elliptical, ...
 - (photometric) redshift
- Also have angular and shape information



Terminology:

$$\text{magnitude} = A - \log(\text{flux})$$

$$\text{color} = \text{magnitude} - \text{magnitude}$$

Need redshifts

- **Spectroscopic** or **photometric** redshifts (photo-zs).

↑
Accurate but
expensive

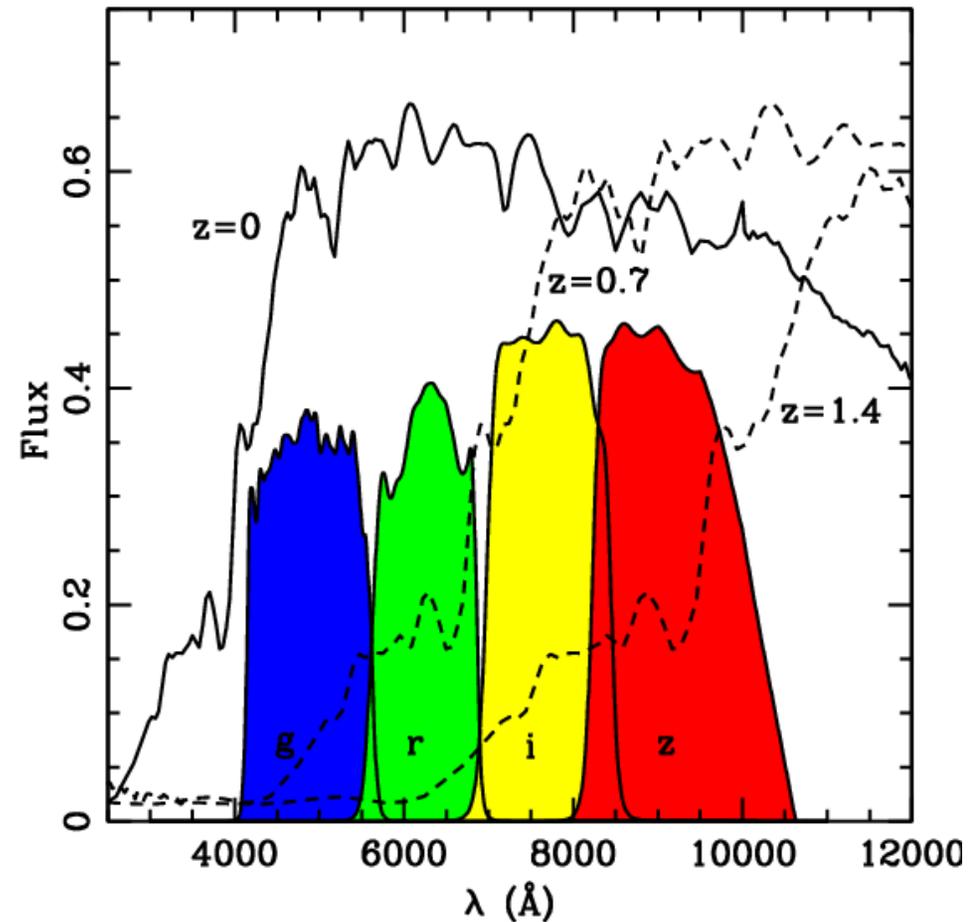
↑
Innaccurate
but cheap

- For large surveys such as DES, PanSTARRS and LSST, photo-zs are the only option (besides cross-correlation techniques).

Redshift issues

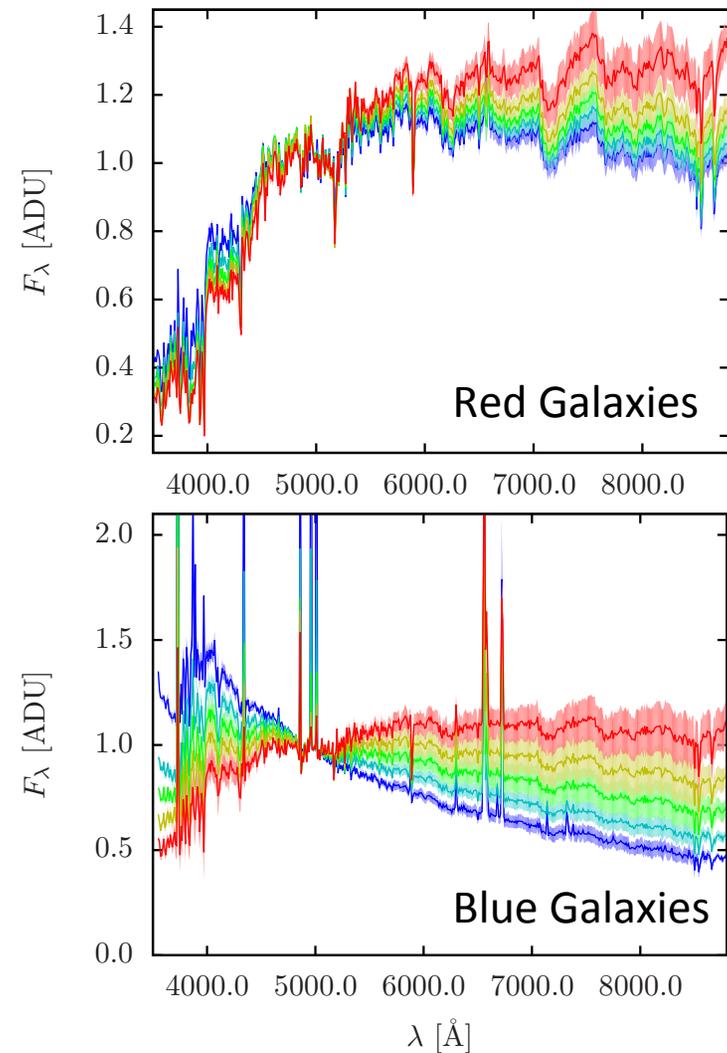
Basics of photo-zs

- Probe strong spectral features (4000 Å break)
- Flux in each filter depends on galaxy's type and redshift.



Basics of photo-zs

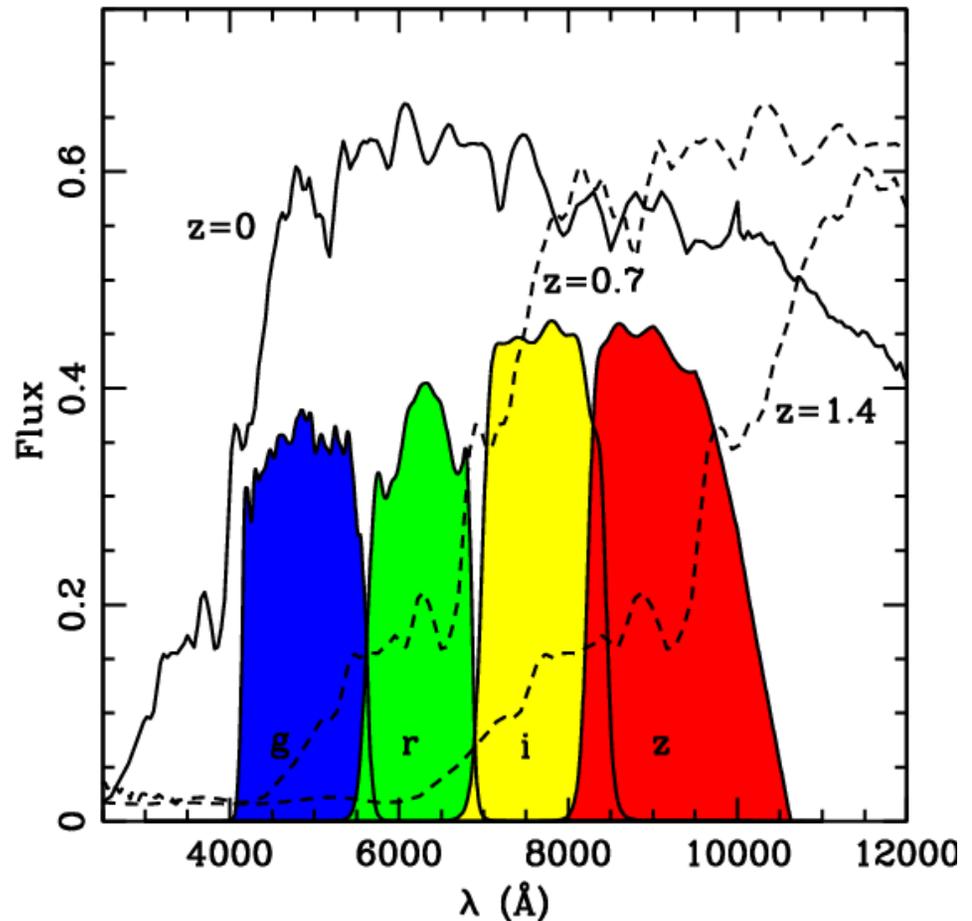
- A difficulty is that there is a distribution of spectral types.
- Galaxy spectra = sum of stellar spectra
- Stellar spectrum \approx blackbody spectrum + absorption and emission



Basics of photo-z's

Two classes of methods:

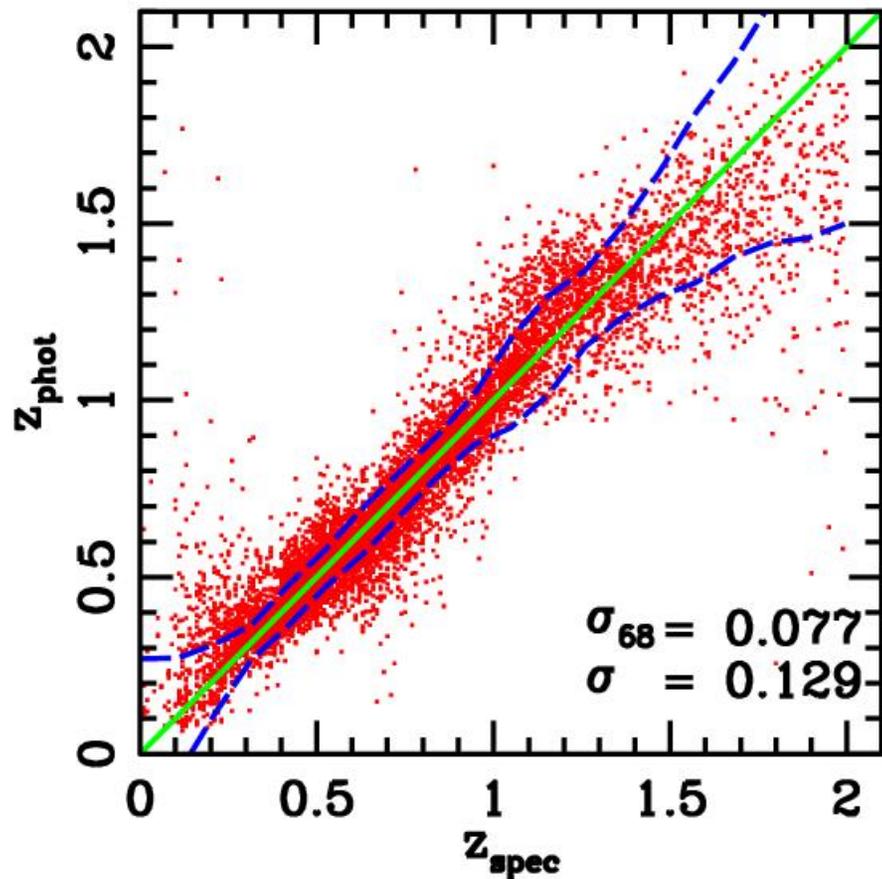
- **Template-fitting:** compare observed fluxes with predicted fluxes from library of galaxy spectra.
- **Training set:** use subsample with known redshifts to “train” flux-redshift relation.



Basics of photo-z's

Photo-zs are often not very good.
Three steps before getting to the cosmology:

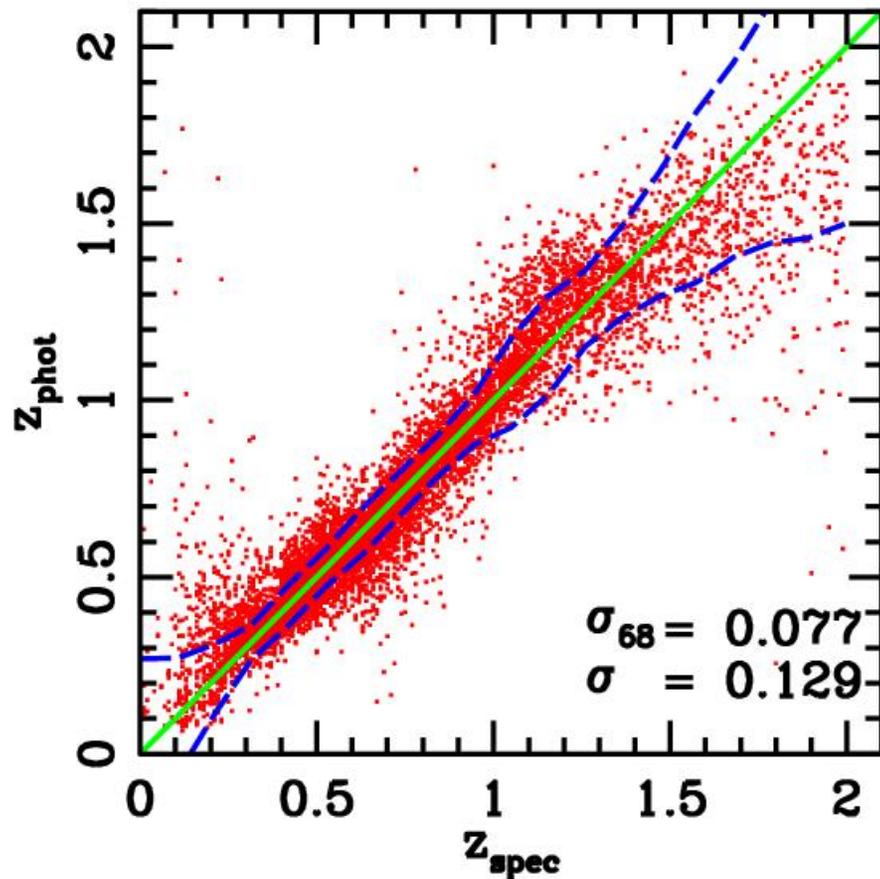
- Get photo-zs;
- Estimate photo-z errors and cull outliers;
- Calibrate error distribution, e.g. $P(z_s | z_p)$.



Basics of photo-z's

Photo-zs are often not very good.
Three steps before getting to the cosmology:

- Get photo-zs; **spectra recommended**
- Estimate photo-z errors and cull outliers; **spectra recommended**
- Calibrate error distribution, e.g. $P(z_s | z_p)$. **spectra required**



Need spectra, so what?

Good spectroscopic samples are hard to come by. **Issues**

- **Selection in observables:** typically have many more bright samples than faint samples.
- **Selection in non-observables:** sample selected for a different purpose with different bands (e.g. DEEP2 survey).
- **Shot-noise:** samples are small.
- **Sample variance:** surveys are pencil-beam.
- **Spectroscopic failures:**
 - Can't get spectra for certain galaxies.
 - Wrong spectroscopic redshifts.

Need spectra, so what?

Good spectroscopic samples are hard to come by. **Solutions**

- **Selection in observables: e.g. Weights** (Lima, Cunha et al 2008)
- **Selection in non-observables: Don't do it.** (Cunha et al 2009)
- Shot-noise: **need many galaxies**
- Sample variance: **need lots of area.**
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Cunha et al. 2012a

Cunha et al. 2012b

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$N(z_{\text{spec}})$

For typical existing spectroscopic samples, sample variance is significantly larger than shot noise.

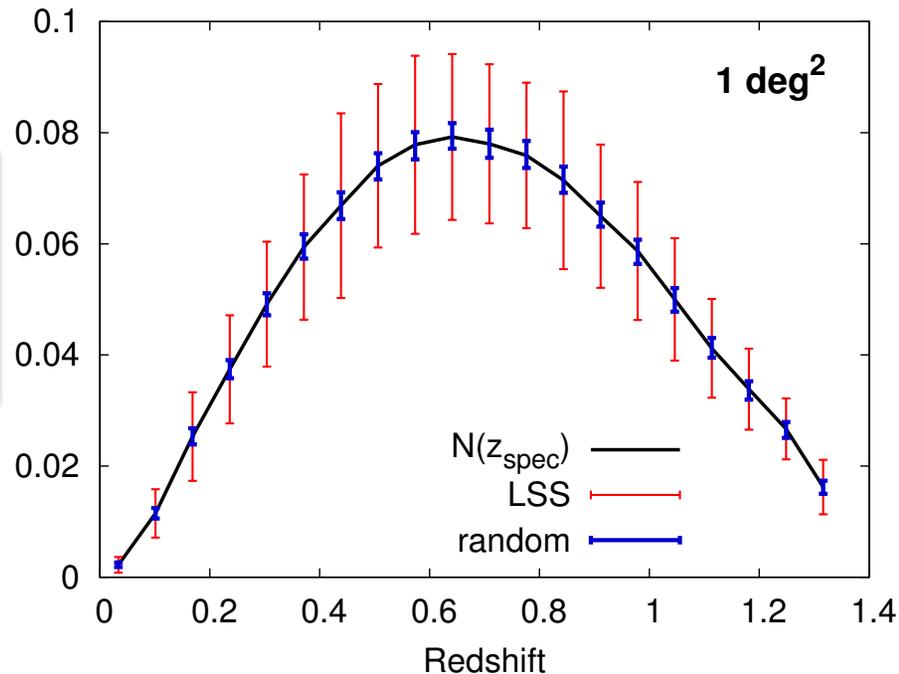


Figure 1. Normalized spectroscopic redshift distribution for the full data. The red (light gray) error bars show the $1-\sigma$ variability in the redshift distribution for contiguous 1 deg^2 angular patches. The blue (dark gray) error bars show the variability in the redshift distribution assuming random samples of with the same mean number of objects as the 1 deg^2 patches. We assume that only a 25% random subsample of each patch is targeted for spectroscopy, yielding about 1.2×10^4 galaxies per patch on average.

Need spectra, so what?

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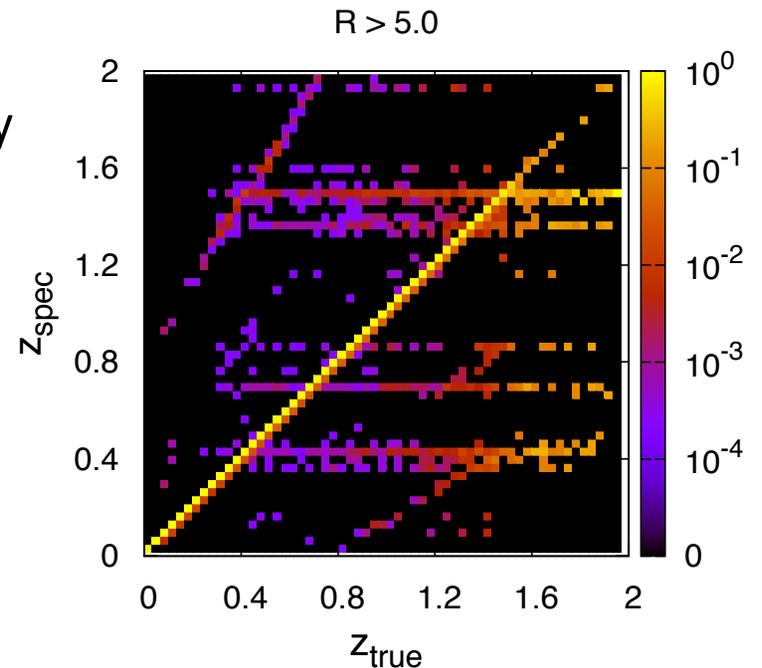
Spectroscopic failures (wrong redshifts)

Issues:

- When spec-z's are wrong, they're really wrong.
- A small speck of wrong redshifts is enough to mess up cosmological constraints.

Sample used in the plot has **98.6%** correct redshifts and constitutes **60%** of total sample (bias in w : $O(100\%)$).

Case study: Simulations of DES photometry + VVDS-like spec-z's



R: cross-correlation parameter (measures redshift confidence)

Angular Issues

Growth of structure

- Want:

$$\delta = \frac{\rho - \bar{\rho}}{\bar{\rho}}$$

Growth of structure

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$$\delta = \frac{\rho - \bar{\rho}}{\bar{\rho}}$$

- (Think you) get:

$$\delta = \frac{N - \bar{N}}{\bar{N}}$$

N : number of galaxies, clusters, ...

Growth of structure

- Want:

$$\delta = \frac{\rho - \bar{\rho}}{\bar{\rho}}$$

- (Think you) get:

$$\delta = \frac{N - \bar{N}}{\bar{N}}$$

N : number of galaxies, clusters, ...

- Actually get:

$$\delta_{obs} = \frac{N_{obs} - \bar{N}_{obs}}{\bar{N}_{obs}}$$

where

$$N_{obs}(x) \equiv (1 + c(x))N(x)$$

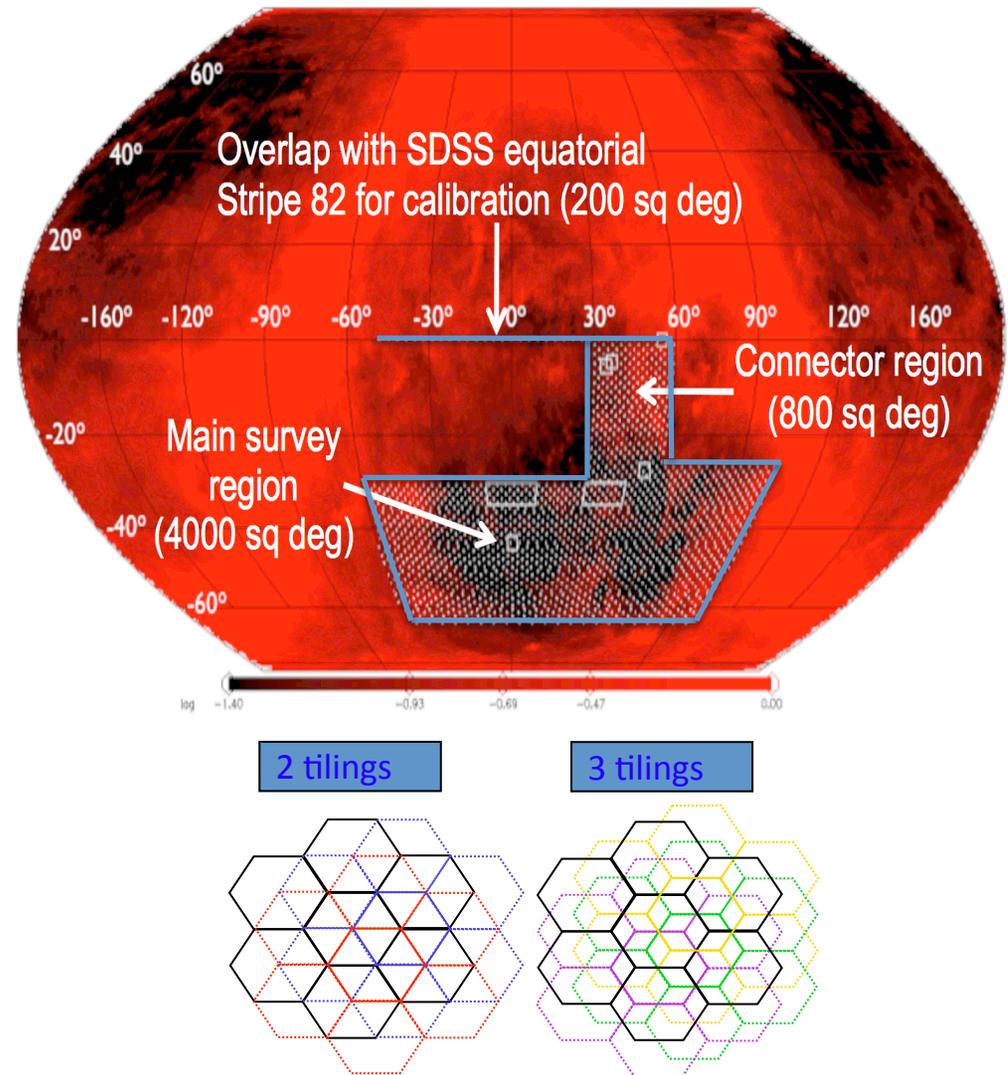
Selection or calibration errors



Sources of calibration error

Photometric calibration is complicated

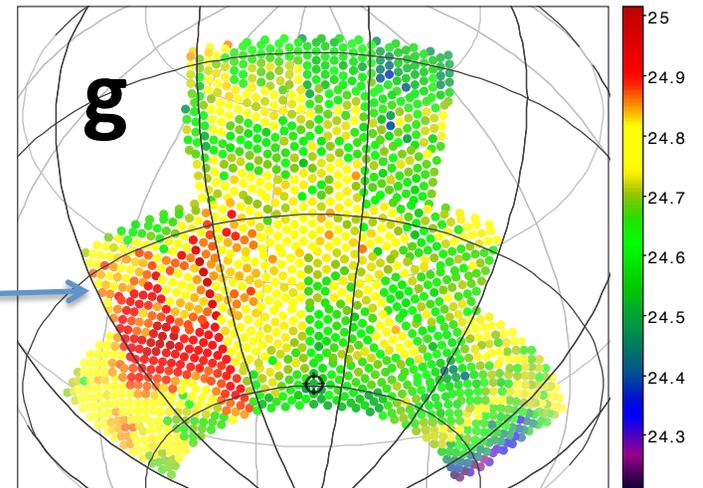
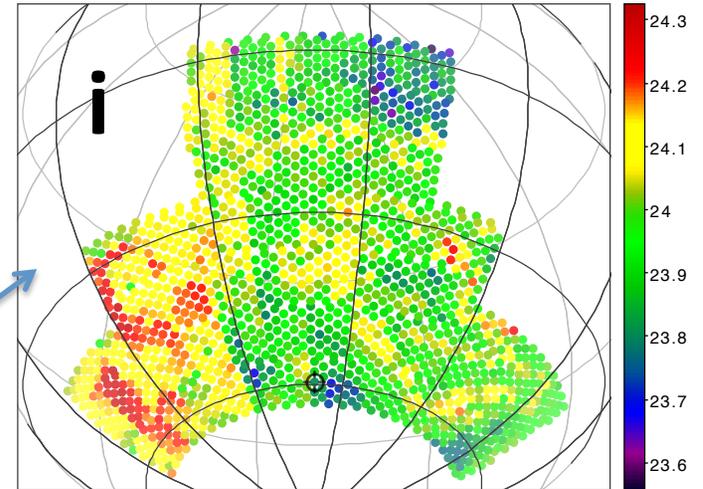
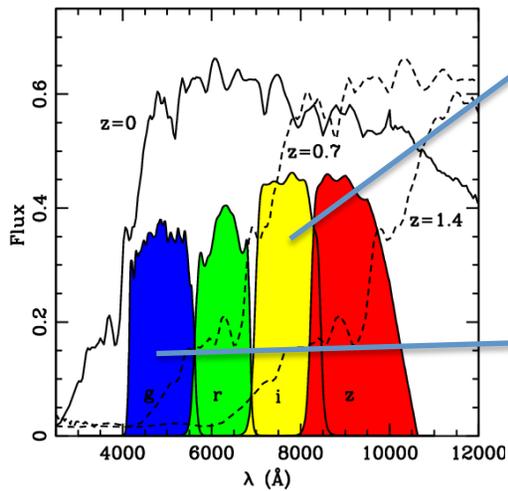
- Deal with: telescope/camera, atmosphere, seasons, Moon, Milky Way – over several years.
- Multiple overlapping tilings with varying orientations + standard stars + ...



Photometric calibration is complicated

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DES 5yr
mag – limits

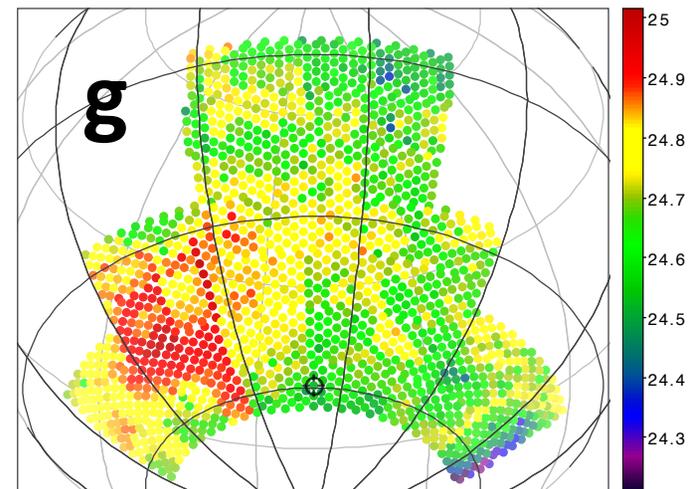
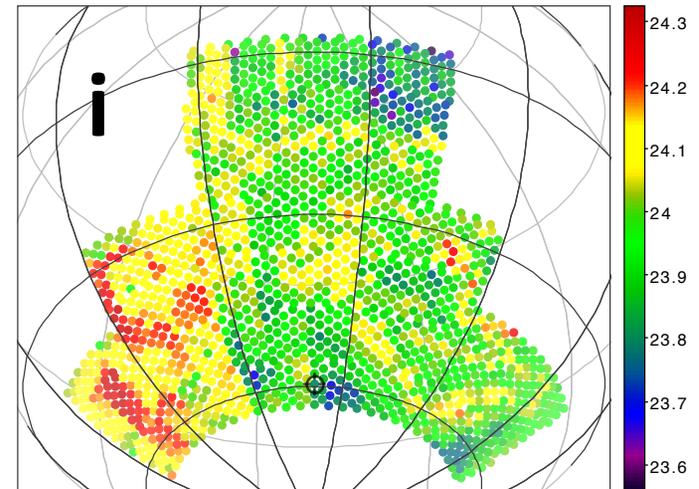


Simulations courtesy of Jim Annis

Life is complicated (even for perfect calibration)

- Mag. Limits affect $N(\theta)$
- Mag. limits affect redshift distribution
-> **coupling between angular and radial effects** (problem is more complicated if using photo-zs).

DES 5yr
mag – limits

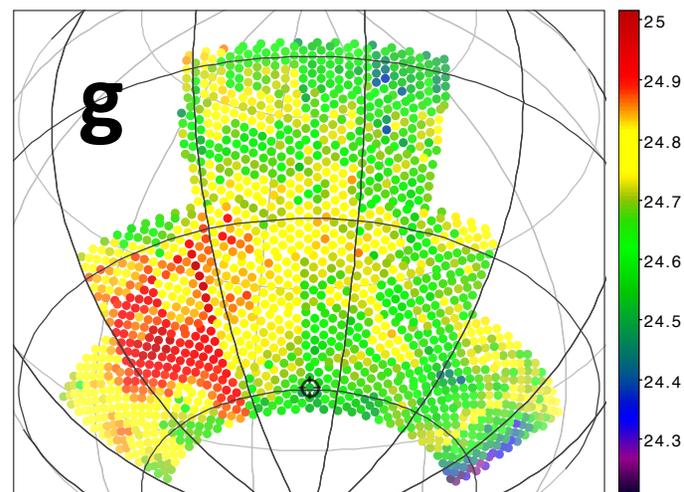
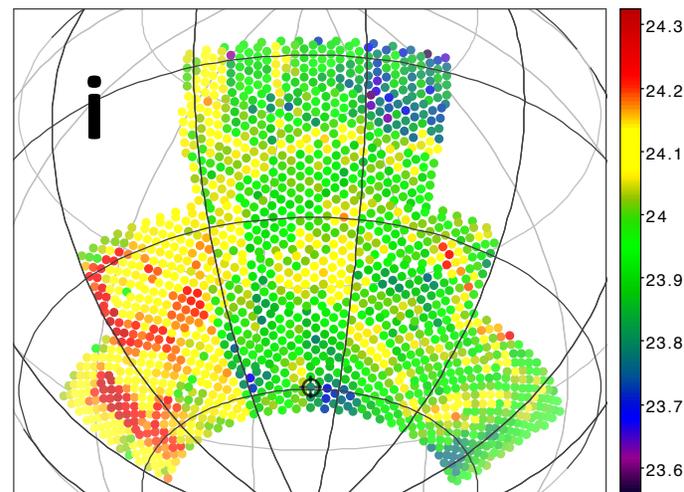


Simulations courtesy of Jim Annis

Life is complicated (even for perfect calibration)

- Mag. Limits affect $N(\theta)$
- Mag. limits affect redshift distribution
-> **coupling between angular and radial effects** (problem is more complicated if using photo-zs).
- Varying colors, affect galaxy types being selected.
 - Different types have different HODs, with different biases.
 - variation in color -> **scale-dependent** halo bias
- Need to couple radial-angular mask
- Uncertainty in calibration will still be a problem.

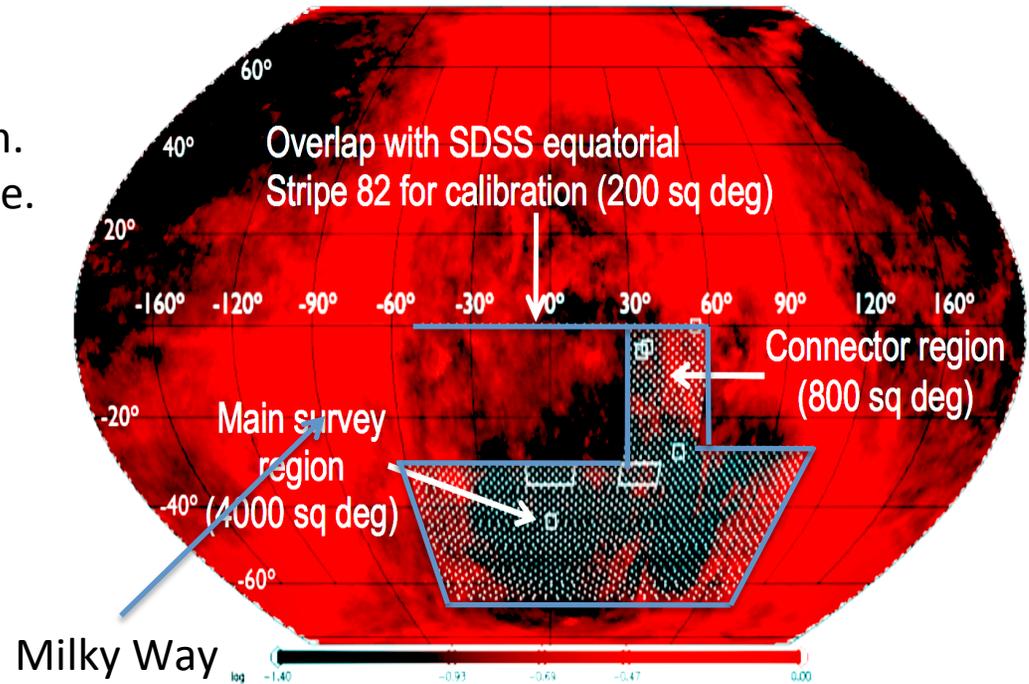
DES 5yr
mag – limits



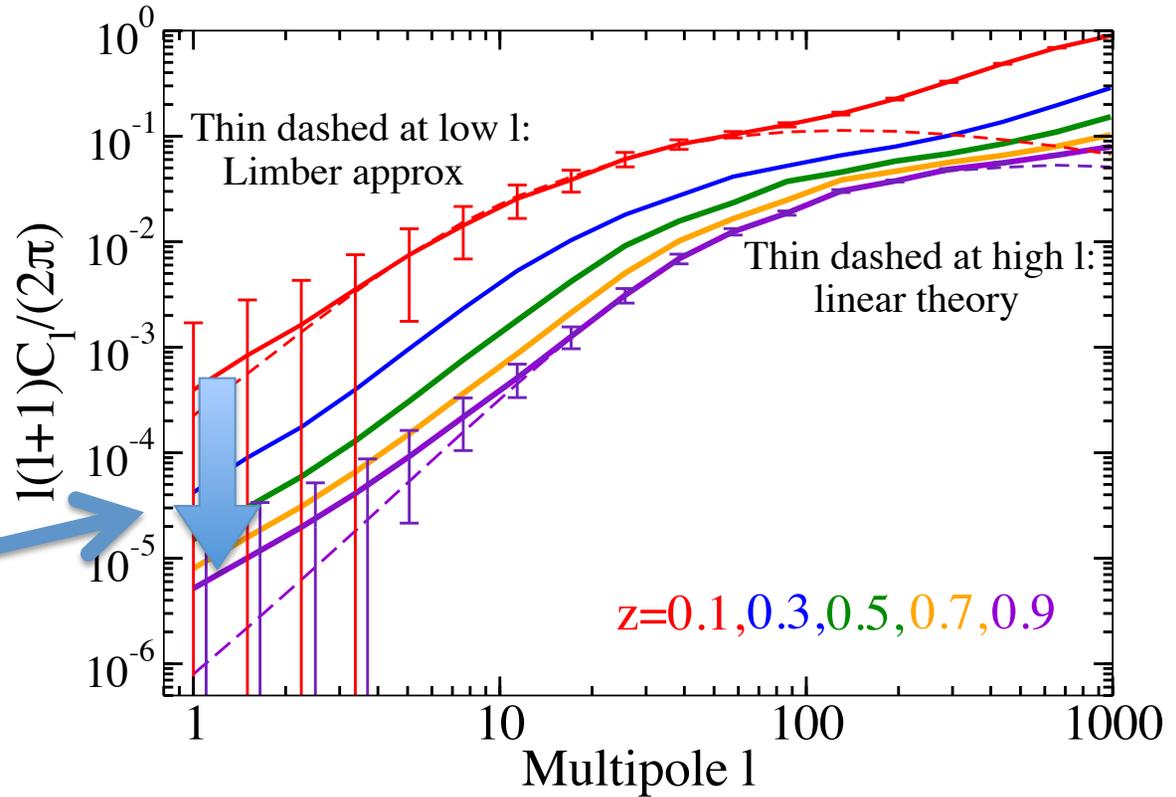
Simulations courtesy of Jim Annis

Star/Galaxy separation

- Distribution of stars is not random. Pronounced variation with latitude.
- Classification using colors (magnitudes)



Galaxy power-spectrum for DES



Power spectrum
decreases with
increasing redshift

Error bars: cosmic variance

Conclusions

- Calibration of wide surveys is a tough challenge.
- Requirements are more stringent for non-Gaussianity constraints.
- The larger scales are more sensitive to the calibration bias.
- Isotropy tests should provide important cross-check.

Modeling the calibration error

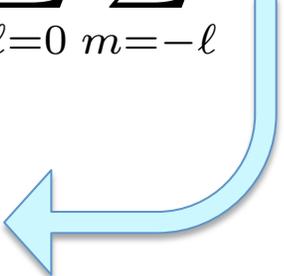
Modeling calibration issues

$$\delta(\hat{\mathbf{n}}) \equiv \frac{N(\hat{\mathbf{n}}) - \bar{N}(\hat{\mathbf{n}})}{\bar{N}(\hat{\mathbf{n}})} = \sum_{\ell=0}^{\infty} \sum_{m=-\ell}^{\ell} a_{\ell m} Y_{\ell m}(\hat{\mathbf{n}})$$

without
calibration
errors

$$\langle a_{\ell m} a_{\ell' m'}^* \rangle = \delta_{mm'} \delta_{\ell\ell'} C_{\ell}$$

Assuming
statistical
isotropy!

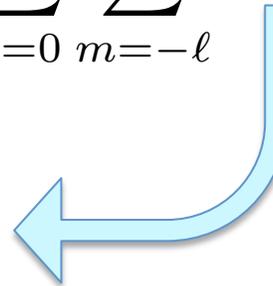


Modeling calibration issues

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with
calibration
errors

$$\delta^{\text{obs}}(\hat{\mathbf{n}}) \equiv \frac{N_{\text{obs}}(\hat{\mathbf{n}}) - \bar{N}_{\text{obs}}}{\bar{N}_{\text{obs}}} = \sum_{\ell m} t_{\ell m} Y_{\ell m}(\hat{\mathbf{n}})$$

$$N_{\text{obs}}(\hat{\mathbf{n}}) = [1 + c(\hat{\mathbf{n}})] N(\hat{\mathbf{n}}) \quad c(\hat{\mathbf{n}}) = \sum_{\ell_1=0}^{\ell_{\text{calib,max}}} \sum_{m_1=-\ell_1}^{\ell_1} c_{\ell_1 m_1} Y_{\ell_1 m_1}(\hat{\mathbf{n}})$$

Modeling calibration issues

without
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$$\delta(\hat{\mathbf{n}}) \equiv \frac{N(\hat{\mathbf{n}}) - \bar{N}}{\bar{N}} = \sum_{\ell=0}^{\infty} \sum_{m=-\ell}^{\ell} a_{\ell m} Y_{\ell m}(\hat{\mathbf{n}})$$

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$$\delta^{\text{obs}}(\hat{\mathbf{n}}) \equiv \frac{N_{\text{obs}}(\hat{\mathbf{n}}) - \bar{N}_{\text{obs}}}{\bar{N}_{\text{obs}}} = \sum_{\ell m} t_{\ell m} Y_{\ell m}(\hat{\mathbf{n}})$$

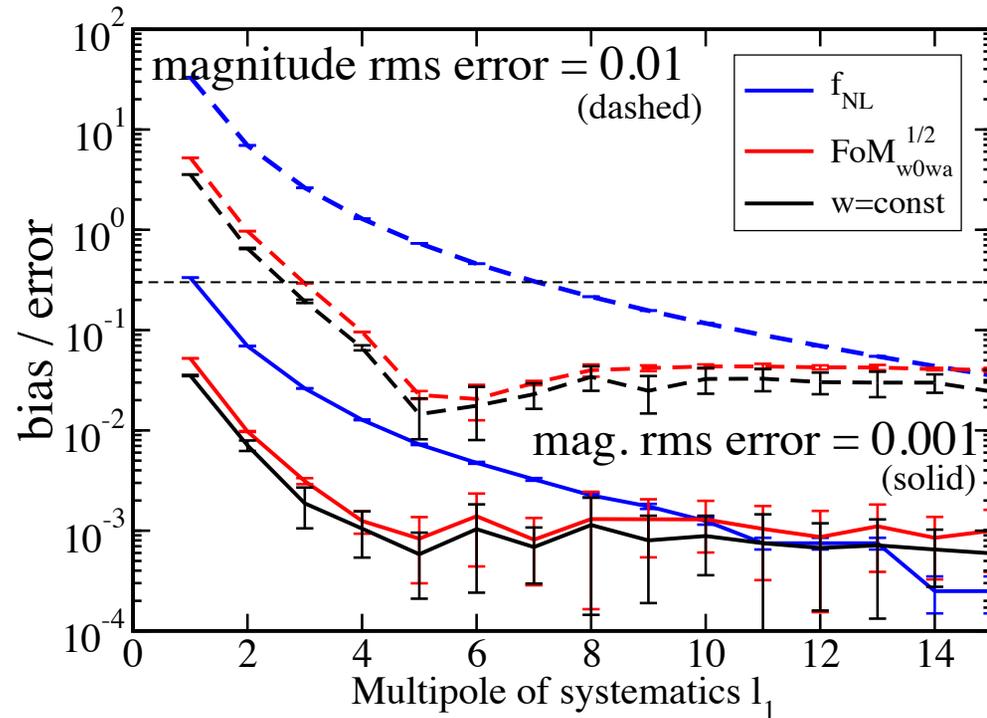
$$N_{\text{obs}}(\hat{\mathbf{n}}) = [1 + c(\hat{\mathbf{n}})] N(\hat{\mathbf{n}}) \quad c(\hat{\mathbf{n}}) = \sum_{\ell_1=0}^{\ell_{\text{calib,max}}} \sum_{m_1=-\ell_1}^{\ell_1} c_{\ell_1 m_1} Y_{\ell_1 m_1}(\hat{\mathbf{n}})$$

$$\langle t_{\ell m} t_{\ell' m'}^* \rangle = \frac{1}{(1 + \epsilon)^2} \left\{ \underbrace{\delta_{mm'} \delta_{\ell\ell'} C_{\ell}}_{\text{isotropic}} + \underbrace{\left[U_{mm'}^{\ell\ell'} C_{\ell'} + (U_{mm'}^{\ell\ell'})^* C_{\ell} \right] + \sum_{\ell_2 m_2} U_{m_2 m}^{\ell_2 \ell} (U_{m_2 m'}^{\ell_2 \ell'})^* C_{\ell_2} + c_{\ell m} c_{\ell' m'}^*}_{\text{breaks statistical isotropy}} \right\}$$

Bias from calibration error in single multipole

Error bars: variations from allocating e_{calib} to different m .

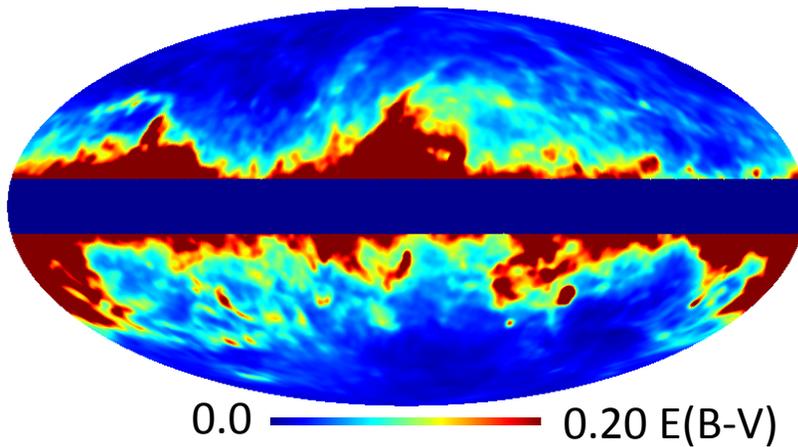
Changes in $m_{\text{lim}}(\theta)$ imply changes in $N(\theta, z)$



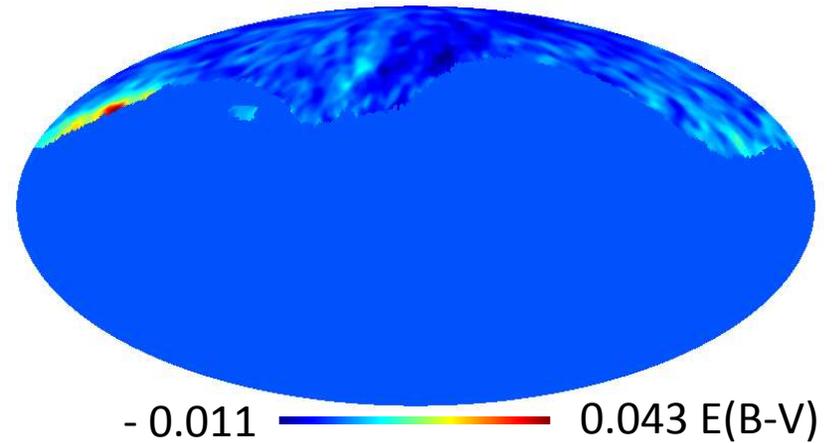
Huterer, Cunha & Fang,
2013, MNRAS.

Example: Dust extinction

Schlegel, Finkbeiner & Davis
(SFD) extinction maps

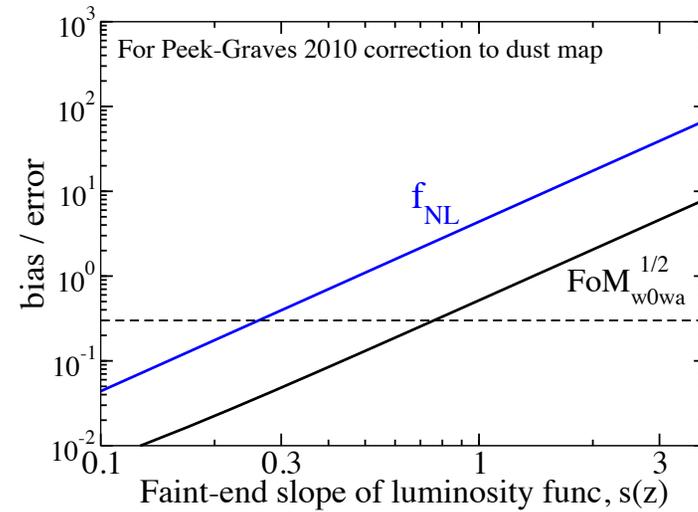
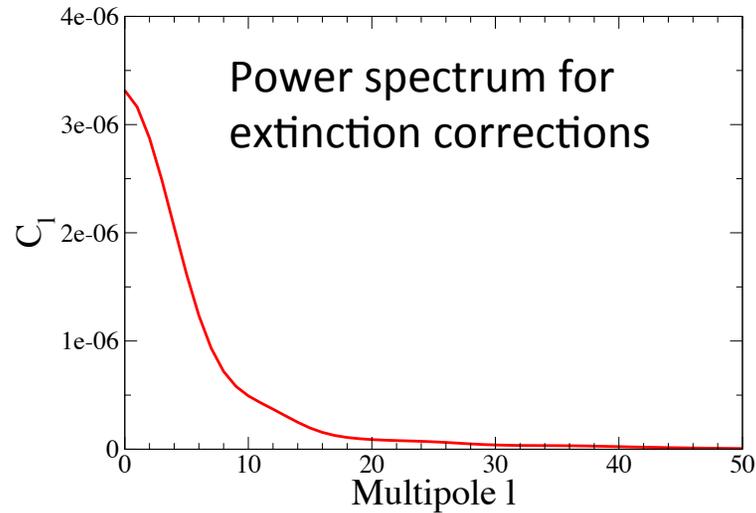


Peek & Graves corrections
to extinction maps



Simple test: Assume Peek & Graves corrections are the calibration error

Example: Dust extinction



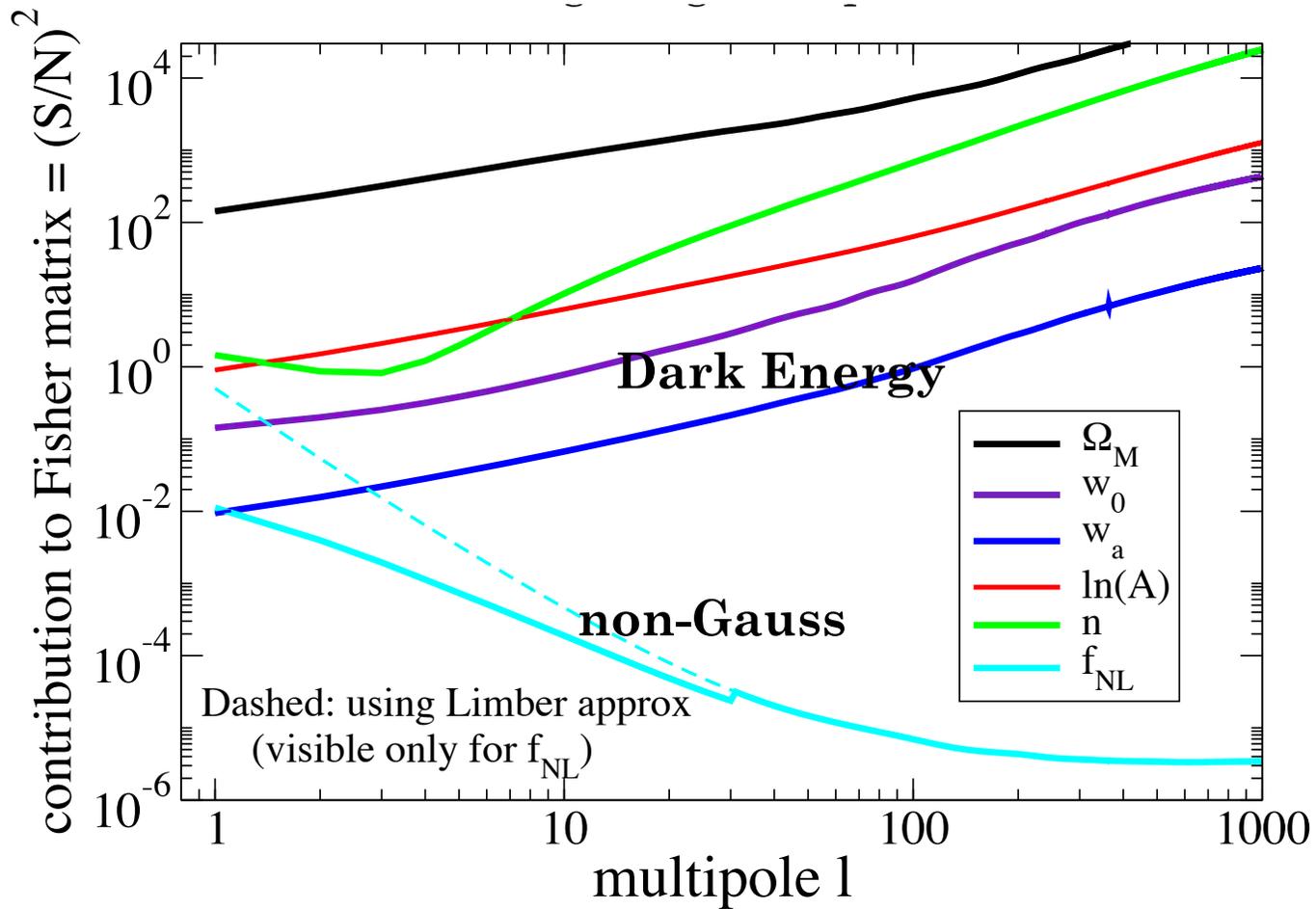
From COSMOS sims,
at $i=24$:

$$s(z) = 0.094 + 0.155z + 0.165z^2$$

$$s(z) = \left. \frac{d \log_{10} N}{dm} \right|_{m_{lim}}$$

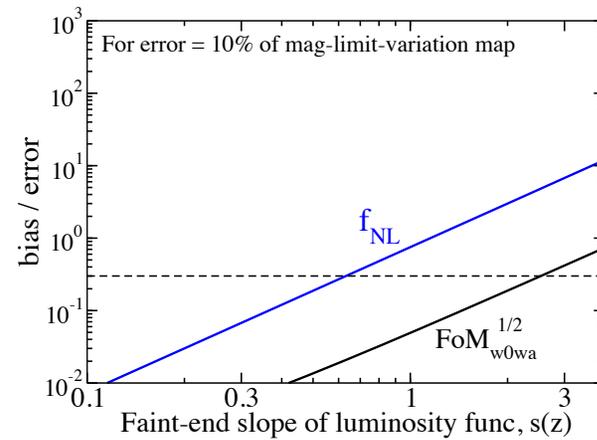
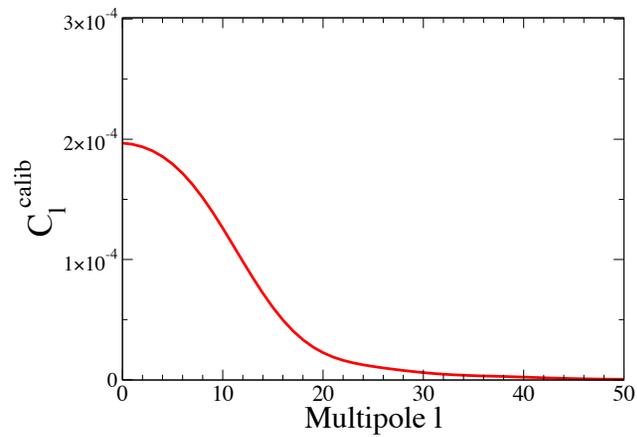
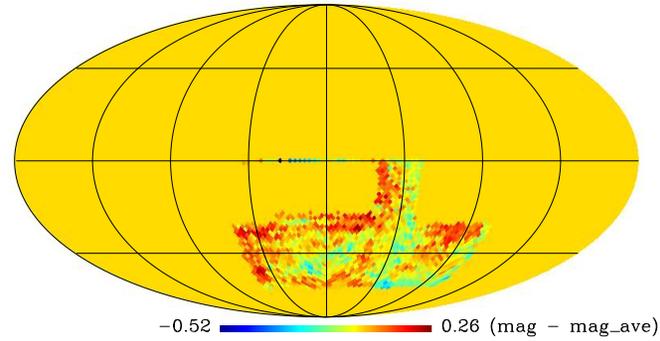
$$\delta p_i \propto \delta C_l \propto |c_{lm}|^2 \propto s(z)^2$$

Where is the information and how much is there?



Example II: DES i-band limits

DES magnitude limit



Observational issues for f_{nl} measurement

- Artificial correlations can mimic f_{nl} . For f_{NL}^{local} , separations >100 Mpc (several degrees) are crucial.

- Artificial correlations can be due to:

- photometric calibration
 - photometric redshifts
 - star/galaxy separation
- } More relevant for galaxies than clusters

Because of $1/k^2$ scale dependence of bias

$$b(k) = b_G + f_{NL} \frac{const}{k^2}$$

- Clusters have own selection issues

The Dark Energy Survey

- Study Dark Energy using 4 complementary techniques:
 - I. Cluster Counts
 - II. Weak Lensing
 - III. Baryon Acoustic Oscillations
 - IV. Supernovae
- Two multiband surveys:
 - Main:** $5000 \text{ deg}^2 \approx 5 (h^{-1}\text{Gpc})^3$
300 million galaxies
g, r, i, z, Y to 24th mag
 - SNe:** 15 deg^2 repeat
- Build new 3 deg^2 FoV camera and Data management system in Blanco 4-m telescope
Survey 2012-2017 (525 nights)
Camera available for community use the rest of the time (70%)

www.darkenergysurvey.org



Sample variance in photo-zs and zspecs

Example:

Distribution of galaxies in
photometric sample:

	1	1	2
z_{phot}	1	6	1
	2	1	1
		z_{spec}	

Distribution of galaxies in
calibration sample:

	1	1	4
z_{phot}	1	6	2
	2	1	2
		z_{spec}	


LSS fluctuation!!!

Sample variance in photo-zs and zspecs

photometric
sample:

1	1	2
1	6	1
2	1	1

1	1	4
1	6	2
2	1	2

calibration
sample:

$P(z_p | z_s)$

0.25	.125	0.50
0.25	0.75	0.25
0.50	.125	0.25

=

0.25	.125	0.50
0.25	0.75	0.25
0.50	.125	0.25

Columns:
 z_{phot}

Rows:
 z_{spec}

$P(z_s | z_p)$

0.25	0.25	0.50
.125	0.75	.125
0.50	0.25	0.25

≠

.167	.167	.667
.111	.667	.222
0.4	0.2	0.4

Sample variance in photo-zs and zspecs

photometric
sample:

1	1	2
1	6	1

1	1	4
1	6	2

calibration
sample:

Conclusion:

$P(z_s | z_p)$ is sensitive to z_{spec} fluctuations, but $P(z_p | z_s)$ is not. Conversely, only $P(z_p | z_s)$ is sensitive to z_{phot} fluctuations.

$P(z_s | z_p)$

.125	0.75	.125
0.50	0.25	0.25

\neq

.111	.667	.222
0.4	0.2	0.4