# The role of DESI in Photo-*z* Calibration for LSST, Euclid, and future cosmological surveys

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### Photometric Redshifts, (Photo-zs)

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Weak lensing surveys require an understanding of the **distance distributions** of lensed objects as well as their lenses to gain insight into cosmology.

- *Redshift, z*  $\propto$  Distance
- The redshift can be known to high confidence from the full **spectral energy distribution** (SED) of a galaxy if it has emission or absorption features
- Most galaxies only have **fluxes** in a few filters







- I. The State of Photo-z Calibration
- II. DESI as a Contributor
- III. Spectroscopic Biases: Brightness
- IV. Photometric Scatter
- V. Conclusions



Galaxy survey imaging, e.g. Vera Rubin Observatory

Image credit: David Kirkby



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### Fluxes + Galaxy Models/Data → Photo-z Estimates



### The Color Space

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ugrizYJHK photometry breaks degeneracies in similar
galaxy SEDs

→ 8-band color space can be discretized using self organizing maps (SOMs).

Weak lensing surveys like DES (*Myles+2021*) and KiDS (*Hildebrandt+2020*) associate galaxy spectra with known *z* with similarly colored wide field galaxies.

*Masters+2015* built a SOM using this deep photometry that approximates the color space that will be visible to LSST and Euclid and informs spec-*z* searches.





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Each 'cell' is a selection of ugrizYJHK colors that we want to populate with spectroscopic galaxies.

![](_page_5_Picture_8.jpeg)

trained on COSMOS photo-zs

![](_page_6_Picture_0.jpeg)

### Where do DESI galaxies live?

### **D**ESI **C**omplete **C**alibration of the **C**olor **R**edshift **R**elationship (DC3R2) [secondary target program]

![](_page_6_Picture_4.jpeg)

![](_page_7_Picture_0.jpeg)

### Where do DESI galaxies live?

### Emission Line Galaxies (ELGs) DESI Complete Calibration of the Color Redshift Relationship (DC3R2) [secondary target program]

![](_page_7_Picture_4.jpeg)

![](_page_8_Picture_0.jpeg)

### Where do DESI galaxies live?

### Luminous Red Galaxies (LRGs) Emission Line Galaxies (ELGs) DESI Complete Calibration of the Color Redshift Relationship (DC3R2) [secondary target program]

![](_page_8_Picture_4.jpeg)

![](_page_9_Picture_0.jpeg)

## **Color Coverage: How it changes with survey**

Mean z

#### Regular DESI Ops + DC3R2

- → ~57% cells covered
- → 241k galaxies
- → SV + partial Y1, DESI Operations
- → 4h Additional Dedicated Tiles

![](_page_9_Figure_7.jpeg)

#### **COSMOS Field Spectroscopy,** *C3R2* + *z*COSMOS + *Others*

- → 64.5% cells covered
- → 27k galaxies
- → > 1200 hrs of exposure on Keck/ VLT/Gemini S/ Subaru

#### SPECTROSCOPIC **Color Coverage: How it changes with survey**

![](_page_10_Figure_1.jpeg)

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INSTRUMENT

![](_page_11_Picture_0.jpeg)

### **Magnitude and Redshift**

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Spectroscopic galaxies are biased to brighter samples than 'wide' field galaxies that they calibrate. For **fixed colors** (e.g. a galaxy phenotype), we want to constrain **the magnitude dependence of redshift.** 

Our SOM method relies on a null hypothesis ( $dz/dm \approx 0$ ) that could be corrected easily to first order if false.

- Preliminary studies find this effect is **linear** and **small** (*Masters+2019*), *dz/dm*
- The photo-z requirement for DESC is on the mean redshift per tomographic bin
   All uncertainties that contribute to dz/dm have to similarly be known to

$$\frac{\Delta z}{(1+\bar{z})} \approx \Delta (dz/dm) \times (\bar{m}_{wide} - \bar{m}_{spec}) \approx 0.001 \text{ (DESC Y10)}$$

![](_page_12_Picture_0.jpeg)

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If we used DESI spectra alone, we have to know the systematics to:

$$\Delta(dz/dm) \le 0.0005$$

#### DARK ENERGY SPECTROSCOPIC **DESI v. COSMOS: Why do they differ?**

INSTRUMENT

![](_page_13_Figure_1.jpeg)

![](_page_14_Picture_0.jpeg)

### **Photometric Scatter as a Systematic**

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![](_page_14_Figure_3.jpeg)

![](_page_15_Picture_0.jpeg)

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![](_page_15_Figure_3.jpeg)

![](_page_16_Picture_0.jpeg)

### **Photometric Scatter as a Systematic**

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![](_page_16_Figure_3.jpeg)

![](_page_17_Picture_0.jpeg)

![](_page_17_Picture_1.jpeg)

- U.S. Department of Energy Office of Science
  - DESI will provide millions of spectra, and has already served to calibrate
     ~54% of the color space visible to Euclid/LSST with areas with high multiplicity.
  - Future DESI efforts and other spec surveys like 4MOST will massively increase spectroscopic coverage.
  - Selection effects on spectroscopic redshifts must be well understood, especially when they will be significantly brighter than wide field galaxies they are meant to calibrate (*dz/dm*).
  - **Deep drilling photometric survey follow ups or good survey simulation** can increase our ability to calibrate for the effect of photometric scatter on this measurement and will be required to meet future photo-*z* requirements.

![](_page_18_Picture_0.jpeg)

### DARK ENERGY SPECTROSCOPIC INSTRUMENT

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![](_page_18_Picture_3.jpeg)

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# Backup

#### What types of galaxies live in this color space?

![](_page_20_Figure_1.jpeg)

### The DESI Effort to Calibrate the Color Redshift Relation

![](_page_21_Figure_1.jpeg)

## Spectroscopic Completeness

Entire, unweighted DESI coverage of C3R2 SOM

~ 60% coverage of the color-space!

(with uniform redshift completeness cuts:  $\Delta \chi^2 > 25$  defining "good spectra")

![](_page_22_Figure_4.jpeg)