Towards precise calibrations of wide-field surveys in the era of LAMOST and Gaia

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## Significance of calibrations

"Without measurement, there would be no science." — Mendeleev

#### "You understand something truly only when you can measure it precisely." — Lord Kelvin

Error = random error + systematic/calibration error Random error = f(SNR)

# Outline

- Photometric calibration of imaging surveys
- Wavelength calibration of (slit-less) spectroscopic surveys
- Flux calibration of slit-less spectroscopic surveys
- Summary

# Photometric calibration of imaging surveys



## Magnitude

$$m_b = -2.5 \log_{10} \frac{C_b}{C_b^{(0)}}$$
$$C_b = \int \frac{f_\lambda(\lambda)}{(h c/\lambda)} R_b(\lambda) d\lambda$$
$$C_b^{(0)} = \int \frac{f_\lambda^{(0)}(\lambda)}{(h c/\lambda)} R_b(\lambda) d\lambda ,$$

Photon counts of a target Photon counts of the standard

$$R_b(\lambda) = R_{\text{atmosphere}}(\lambda) R_{\text{optics}}(\lambda) R_{\text{filter}}(\lambda) R_{\text{detector}}(\lambda)$$

- Friendly to astronomer: dependent on expected photo counts only, purely observational
- Unfriendly to astrophysicist: interpretation involves physical properties of a target ( $f_{\lambda}(\lambda)$ ) and the measurement effect ( $R_b(\lambda)$ )

D. Hogg 2022 (arXiv:2206.00989)

#### **Challenges of photometric calibration**

 $R_b(\lambda) = R_{\text{atmosphere}}(\lambda) R_{\text{optics}}(\lambda) R_{\text{filter}}(\lambda) R_{\text{detector}}(\lambda)$ 



## **Photometric calibration**

- Absolute calibration vs. Relative calibration
- Magnitude calibration vs. Color calibration
- mag = mag\_raw + zero\_point (zpt)
- zpt (t) vs. zpt (t,x,y,mag,color)

## **Tools of photometric calibration**

- · Classical standard stars (e.g., Landolt 1992), but too few
- Based on better understanding of astronomical observations
  - (Most) Stars are non-variables (Ubercalibration; Padmanabhan+08);
  - Illumination corrections are uncorrelated between surveys (Hypercalibration; Finkbeiner+15)
  - Forward Global Photometric Calibration (Burke+18)
- Based on better understanding of astronomical objects (stars)
  - Stellar locus is "universal" (stellar locus regression; High+09)
  - Stellar colors are simple (stellar color regression; Yuan+15)

#### All methods are complementary

# Ubercalibration

- require over-lapping observations
- I-2 % precision in SDSS and 1% precision in PSI



FIG. 2.—Sky coverage of the SDSS data used in this paper, shown in an equal-area resolution 7 HEALPIX/HEALCART (Górski et al. 1999; Finkbeiner 2004) projection. The x-scale covers R.A. =  $0^{\circ}$ -360°, while the y-axis runs from decl. =  $90^{\circ}$  to  $-90^{\circ}$ . The gray scale denotes the mean number of observations of a star in a particular pixel. Note that we saturate at five observations, although on the equatorial (white) stripe, there are pixels with a mean number of observations as high as 15. The bulk of the survey data is in the north Galactic cap, the prominent structure in the center of the image. The equatorial stripe, imaged every fall, is the white horizontal stripe halfway in the image. The approximately equally spaced vertical runs are examples of the Apache Wheel data.

SDSS analysis indicates that unmodeled variations in atmospheric extinction dominate residual calibration errors. Simulations with no random fluctuations achieve calibration errors of 0.1%.

#### Hypercalibration: a PSI-based recalibration of the SDSS Finkbeiner+2015 Before recalib.: >10mmag After recalib.: <10mmag

U

7



### Forward Global Photometric Calibration (Burke+18)







**Figure 2.** Radial variation of the blue edge of the *i*-band passband due to the filter. Each line represents one CCD, and the color represents the distance (degrees on the sky) of the CCD from the center of the field of view.

Construct models of atmosphere and instruments, with parameters constrained by data taken with auxiliary instrumentation and repeated observations, with chromatic correction included naturally

A few mmag precision for DES

#### Stellar locus regression (High+09)

- degeneracy problem: require a blue filter (e.g, u-band)
- restricted to lowextinction regions
- a few per cent accuracy



## Stellar colors are a little bit complicated





[Fe/H]-dependent stellar locus:  $color1_0 = f(color2_0, [Fe/H])$ 

Star-pair technique: color<sub>0</sub> = f (Teff, [Fe/H], Logg,..)

#### LAMOST: delivering ~10<sup>7</sup> stellar spectra/parameters

в

С







#### Yan et al. 2022

## Stellar color regression

Stellar colors are (relatively	Yuan et al. 2015y) simpleHuang et al. 2022	
<ul> <li>Color<sub>0</sub> = f (Teff, [Fe/H], logg,</li> </ul>	) Star-pair	
= f (spectra)	Data-driven	
= (color2, [Fe/H])	Metallicity-dependent stellar locus	
= f (U-B, B-V, V-R,)	Data-driven	

Color = Color<sub>0</sub> + reddening

•

Millions of color standard stars in the era of LAMOST ... Millions of standard stars in the era of LAMOST and Gaia

zero\_point = f(frame, X,Y, mag., color, ...)

#### Gaia: delivering mmag precision photometry



- 1. Space mission  $\rightarrow$  not affected by atmosphere
- 2. CCD in TDI mode  $\rightarrow$  1D flat
- 3. Scanning mode + ~70 visits/5year,  $\rightarrow$  ubercal naturally

## SCR in the era of LAMOST and Gaia

Use millions of spectroscopically observed stars as standards

- $G_{BP} x = (G_{BP} x)_0 + k^* reddening$
- $(G_{BP} x)_0 = f(Teff, [Fe/H], logg, a/Fe...)$
- $x = G_{BP} f$  (Teff, [Fe/H], logg, a/Fe) k\*reddening

• zero\_point = f(frame, X,Y, mag., color, ...)

## SCR in the era of LAMOST and Gaia

Stripe 82 colors; 2-5 mmag; <10 mmag; Skymapper DR2; Gaia DR2 colors; ~ 1 mmag; Gaia EDR3 colors; < 1 mmag; Gaia EDR3 mags.; < 1 mmag; J-PLUS DR2; 2-10 mmag; Stripe 82 ugriz; **2-5 mmag;** PS1 DR1 grizy; ~2 mmag; mini-JPAS 56 filters; 2-5 mmag;

Yuan et al. (2015) Huang, Yuan+, et al (2021) Niu, Yuan & Liu (2021a) Niu, Yuan & Liu (2021b) Yang, Yuan+ (2021) Lopez-Sanjuan, Yuan+ (2021) Huang & Yuan (2022) Xiao & Yuan (2022) Yuan et al. (2022)

SAGES DR1 u/v;	~5 mmag;	Yuan+ in prep.
SAGE DR1 g/r/i;	< 5 mag;	Xiao+ in prep.
J-PLUS DR3;	2-5 mmag;	Xiao+ in prep.

## Gaia calibration errors as a function of Magnitude



#### **Color correction curves for different subsamples**

#### G-RP = f(Teff, FeH, Logg) + k\*E(B-V)



#### Color correction curves for Gaia DR2







# Gaia EDR3

#### Niu, Yuan & Liu (2021b)



#### Photometric metallicities of Gaia stars Xu et al. 2022



## Improvement of the PS1 calibration



Haleakala, Hawaii

.2

400

Pan-STARRS (PS1)

30,000 deg<sup>2</sup> in grizy
FOV: 3.3 deg
Ubercalibration

(Padmanabhan et al. 2008; Magnier et al. 2020)

- PS1 has been widely used as reference to others:
  - SDSS (Finkbeiner et al. 2016)

▶ ...

- **BASS** (Zou et al. 2017; Zhou et al. 2018)
- J-PLUS (Lopez-Sanjuan et al. 2019, 2021)
- Type Ia supernovae (Scolnic et al. 2015; Brout et al. 2021)

.8 .8 .8 .6 .4 .4

600

g

North of Dec -30 deg

7

1000

800

Wavelength [nm]

#### Improvement of the PS1 calibration



#### Xiao & Yuan 2022



 $M_{\text{mod}} = G_{\text{BP}}/G_{\text{RP}} - f(T_{\text{eff}}, \text{[Fe/H]}, \log g, ...) - \text{Reddening}$ 

 $\Delta M = M_{\mathrm{mod}} - M_{\mathrm{obs}}, \ M \in \{grizy\}$ 

## Improvement of the PS1 calibration

#### **Spatial variations of PS1 calibration errors**



## **Correction maps of the full footprint**

Xiao et al. in prep.



Wavelength calibration of slit-less spectroscopic surveys

## **CSST slit-less spectroscopic survey**



Challenges: spectral extraction; wavelength & flux calibrations

## Wavelength calibration of long-slit/fiber spectra



#### **Dispersion solution:** lambda = f (X, Y)

Note: The wavelength zero-point usually shifts with time/environment

#### Wavelength calibration of slit-less spectroscopy

lambda = f(x,y, x',y')

(x',y') = f(ra, dec)



FIG. 2.—Projection of pixel  $p_j$  onto the set of spectral bins  $[\dots, b_{i-1}, b_i, b_{i+1}, \dots]$ . For the given trace and extraction direction (gray, thin lines),  $p_j$  contributes with the weight (=area)  $a_{j,i-1}, a_{j,i}, a_{j,i+1}$  to the bins  $b_{i-1}, b_i, b_{i+1}$ .



# Old approach

Compact, bright, and stable targets in a sparse field and with a good grid of emission lines are typically chosen (Pasquali+06)

- Planetary nebulae in external galaxies
- Wolf-Rayet stars
- Ae stars, Be stars
- Cataclysmic variable stars
- Young stellar objects
- -AGNs

#### A new star-based approach Yuan et al. 2021



Fig. 1: Example of segment spectrum from HD196218 ( $T_{eff} = 6207 \text{ K}$ ,  $\log g = 4.11 \text{ dex and } [Fe/H] = -0.19 \text{ dex}$ ). The black and yellow lines are the degraded (R = 250) NGSL spectrum and its continuum obtained by the simple approach in Paper I, respectively. The boundaries between adjacent segments (marked



Fig. 2: The median values of  $\sigma_{RV}$  as a function of  $T_{eff}$  at SNR = 100 for different segments. The values for the whole GU/GV/GI band are also plotted for comparison.

## **Expected precision**



Table 2: Wavelength calibration errors for the GU/GV/GI bands at N=100, 400.

Wavelength Range	Dispersions of $\Delta \lambda$	
(Å)	$({\rm kms^{-1}})$	
	N = 100	N = 400
GU-All: 2550-4200	4.7	2.2
GU-No.1: 2550-2870	4.8	2.4
GU-No.2: 2870-3245	3.9	1.8
GU-No.3: 3245-3690	4.3	2.0
GU-No.4: 3690-4200	5.8	2.6
GV-All: 4000-6500	24.8	11.4
GV-No.1: 4000-4530	22.8	11.8
GV-No.2: 4530-5115	27.4	10.8
GV-No.3: 5115-5770	18.2	8.0
GV-No.4: 5770-6500	38.4	18.9
GI-All: 6200-10000	34.1	18.1
GI-No.1: 6200-6890	38.9	18.6
GI-No.2: 6890-7600	29.1	15.9
GI-No.3: 7600-8380	35.1	19.9
GI-No.4: 8380-9240	23.9	11.9
GI-No.5: 9240-10000	54.4	31.1

## Applying to APOGEE







delta(RV)

# Flux calibration of slit-less spectroscopic surveys

# Flux calibration

- F(lambda)
  - 3D flat cube = f(x,y, lambda)
  - Hubble: 1-2% within given area and wavelength range
  - CSST?



FIG. 13.—Sensitivity functions of the grism first order when coupled with the WFC and the HRC.





#### Calibrating slit-less spectra to ~1% precision

- Predicting colors, magnitudes to ~1% precision for millions of stars with Gaia + LAMOST-like data
- Predicting SEDs (R250) to ~1% with precise stellar parameters, normalized spectra, multi-band photometry for millions of stars
- Flat cube f(x,y, lambda) can then be well constructed
- Gaia spectrophotometry

#### Predicting R200 SEDs with normalized R2000 spectra

#### Yang et al. in prep.

We use the LAMOST normalized spectra of R = 2000 (4000-7000Å)to predict the CSST SEDs of R = 200 over the whole wavelength (2550-10500Å)

From observable to observable



Fig. 1. (a) A sub-unit of the proposed network, where C, W, and 1 in C \* W \* 1 are the indicators of the number of channels, width, and height of the feature map, respectively. (b) Overall architecture of the proposed network.



#### Examples



[Fe/H] = -0.5

SNR=80

SNR=80

 $T_{\rm eff} = 7000 {\rm K}$ logg = 2.5 [Fe/H] = -0.5

 $\alpha/\text{Fe}] = 0.25$ 

[C/Fe] = -0.75

SNR=80

 $T_{\rm eff} = 8000 {\rm K}$  $\log g = 3.0$ [Fe/H] = -0.5

 $[\alpha/Fe] = -0.25$ 

SNR=80

 $T_{\rm eff} = 9000 {\rm K}$ 

[Fe/H] = -0.5

[C/Fe] = -0.5

SNR=80

10000

 $\left[\alpha/\text{Fe}\right] = 0.0$ 

9000

8000

 $\log g = 2.0$ 

[C/Fe] = 0.5

# Summary

- SCR + Gaia + LAMOST/... are very promising to provide millions of precise (1-2%) standard stars in different filters and colors
- A number of surveys have been re-calibrated to a precision of a few mmag, opening up new discovery space
- With SCR, FGCM and other methods and more data, mmag precision photometric calibration is on the way
- Using millions of stars as standards, precise wavelength and flux calibration is possible for the CSST slit-less spectroscopic survey