# Dust and metallicity with UVEX

UVEX Community Workshop, Caltech, 14 March 2023

# **Broad areas**

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### **Photometry:**

- Sensitive maps of dust extinction.
- Metallicities of ~300×10<sup>6</sup> stars.

## **Broad areas**

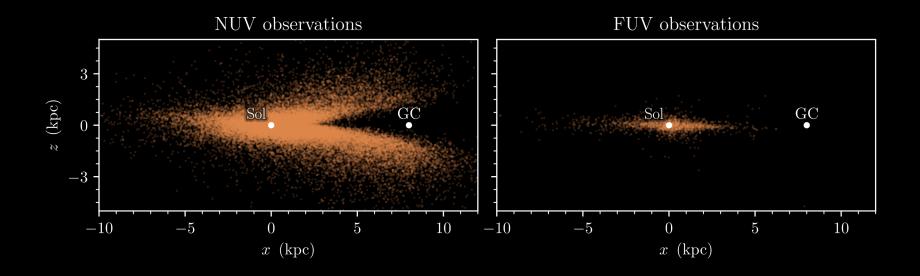
### **Photometry:**

- Sensitive maps of dust extinction.
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### **Spectroscopy+Photometry:**

• Variation in dust extinction curve.

# **UVEX all-sky survey**

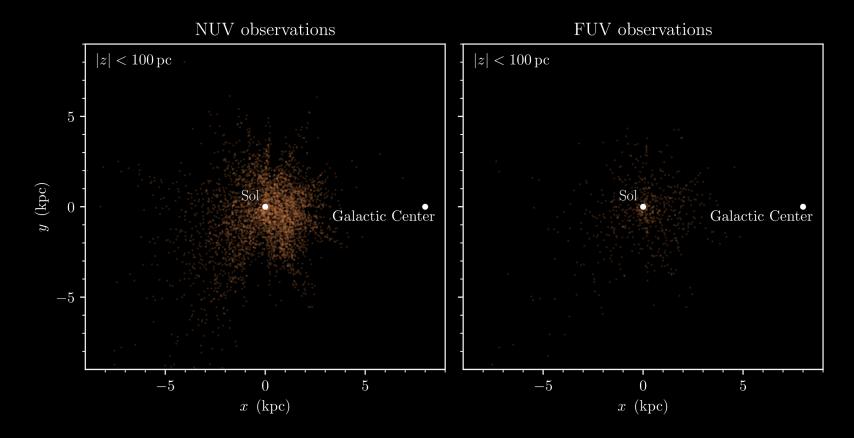


~300 million stars observed in NUV.

~25 million stars observed in FUV.

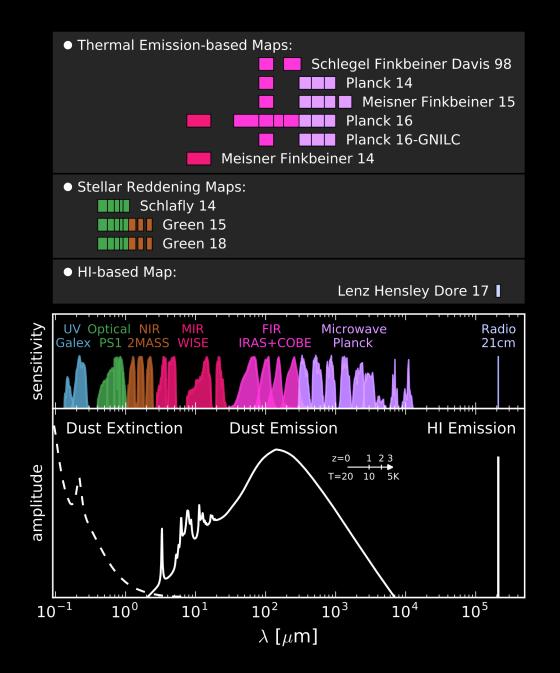
(Kulkarni *et al.* 2022)

# **UVEX all-sky survey**



(Kulkarni et al. 2022)

Mapping dust extinction

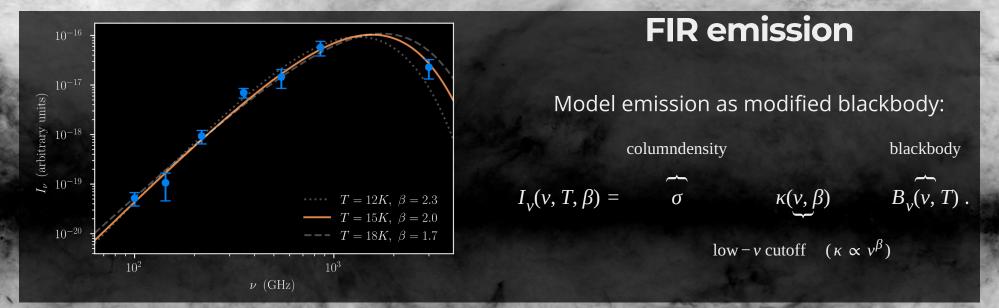


(Chiang & Ménard 2018)

1. Thermal emission (FIR)

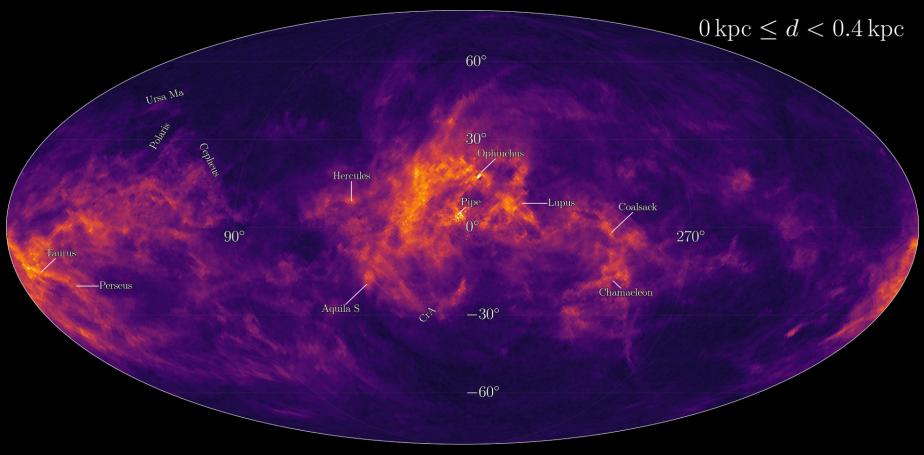
- 2. Stellar extinction (Optical/NIR)
- 3. HI emission (21 cm)

(Schlegel, Finkbeiner & Davis 1998)



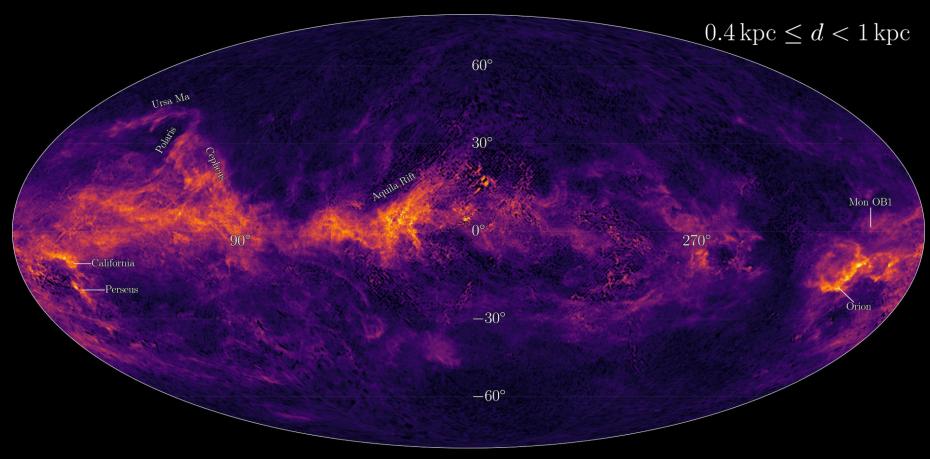
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#### **3D dust from 220 million stars with Gaia XP spectra**



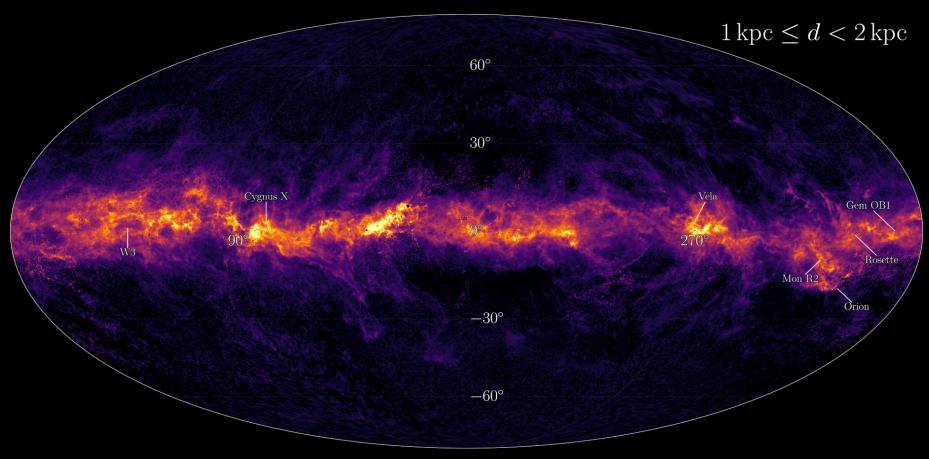
(Zhang, Green & Rix 2023)

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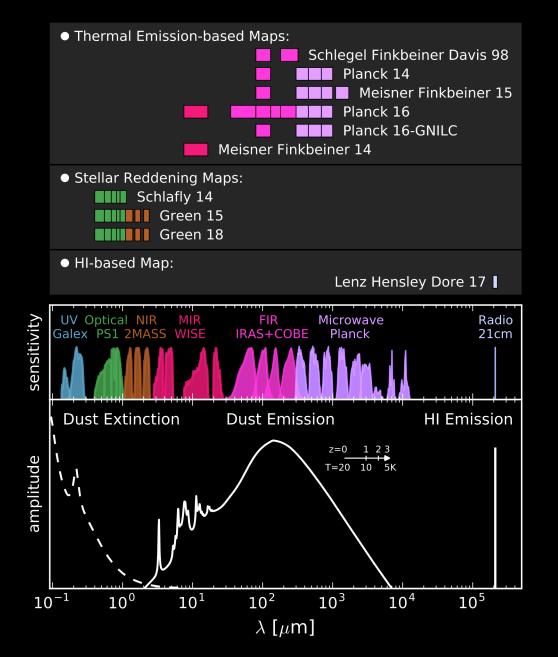


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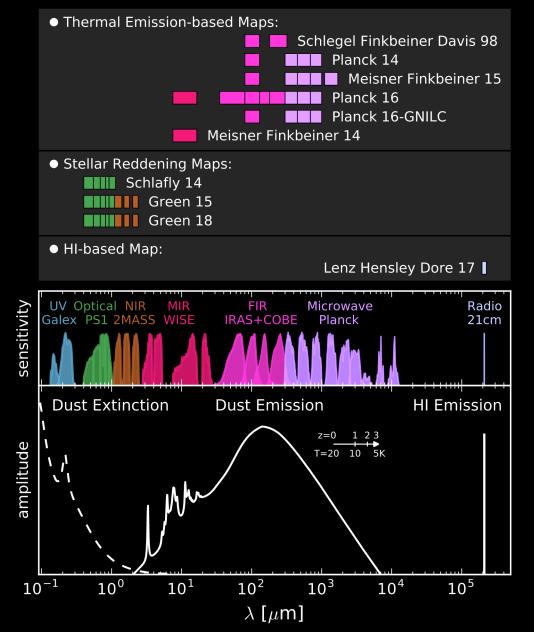


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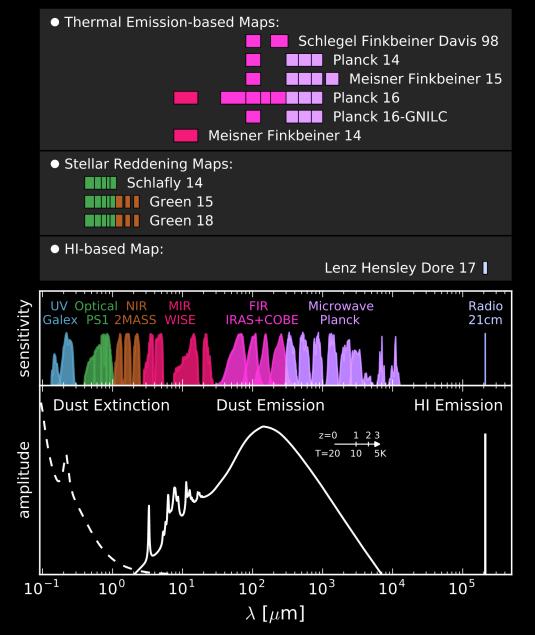


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Advantages of stellar extinction method:

- Directly measures what we want to know: extinction.
- 3D extinction: stars trace dust at different distances.



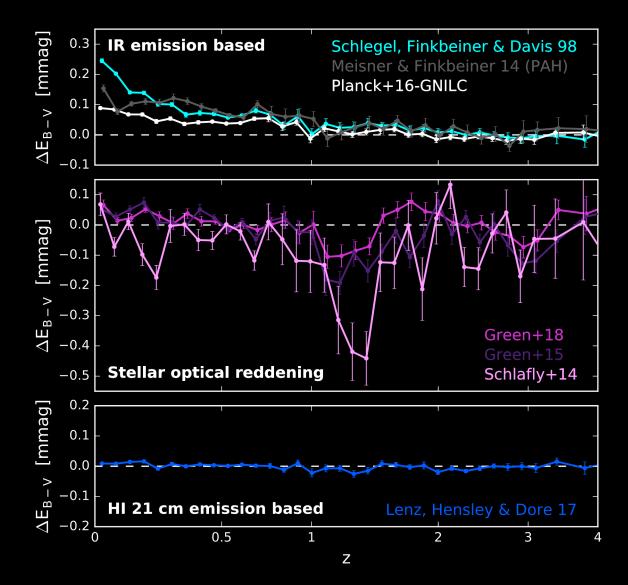
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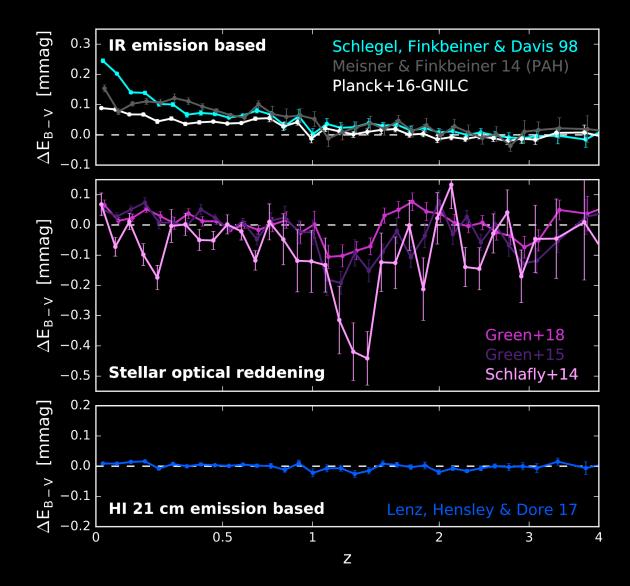
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Note: lack of UV photometry in stellarbased dust maps.



### Contamination from large-scale structure

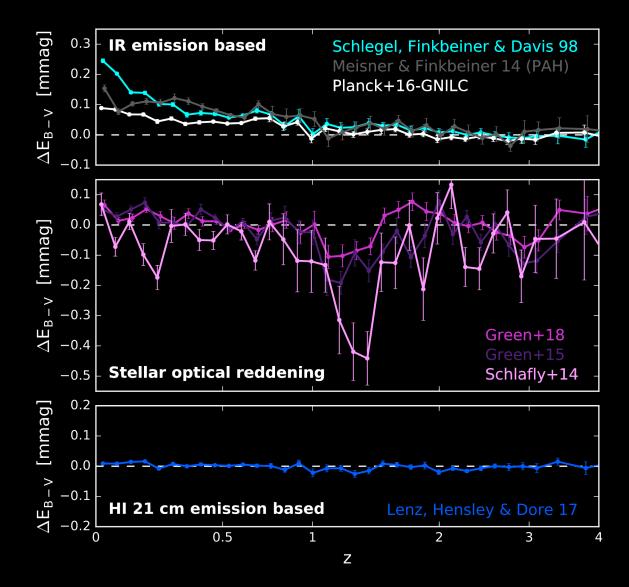
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### Contamination from large-scale structure

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FIR maps contaminated by emission from low-z galaxies.



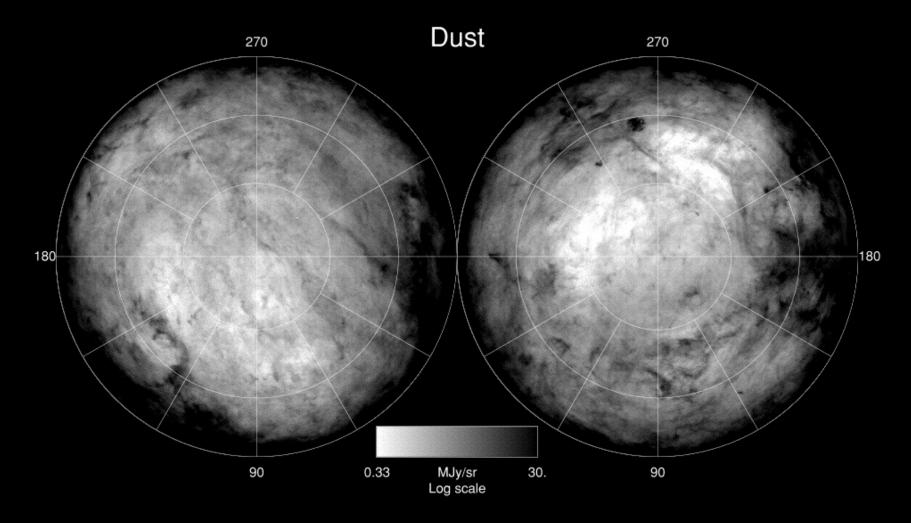
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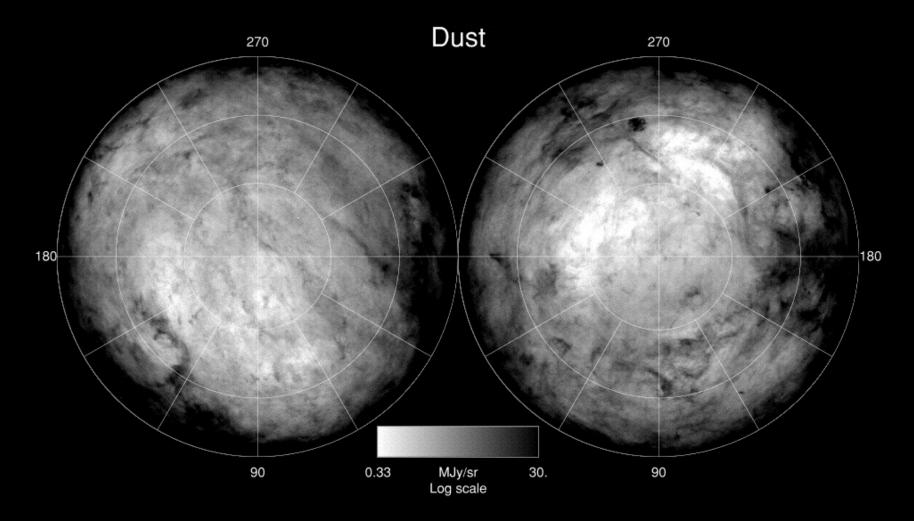
Star-based maps contaminated by z ~ 2 QSOs, though careful cleaning can help (*e.g.*, Mudur *et al.* 2022).

#### Extragalactic astronomy: low-extinction regions



(Schlegel, Finkbeiner & Davis 1998)

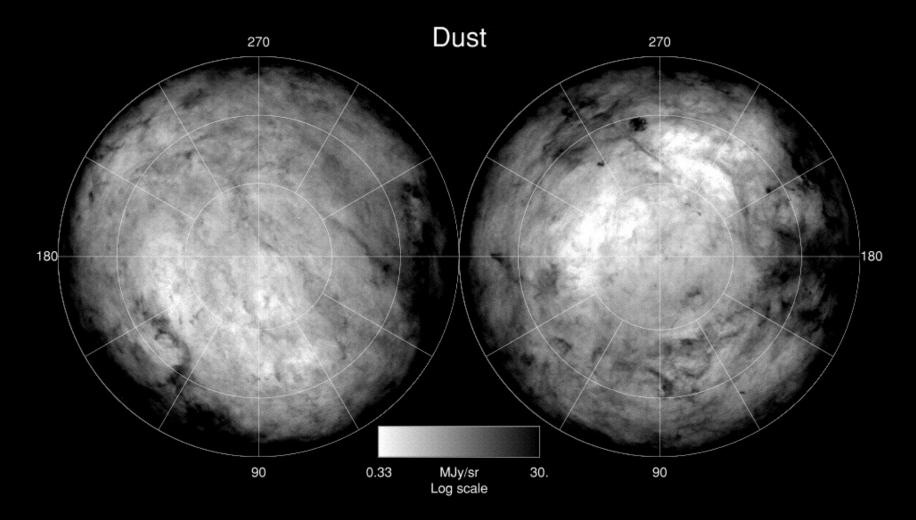
#### Extragalactic astronomy: low-extinction regions



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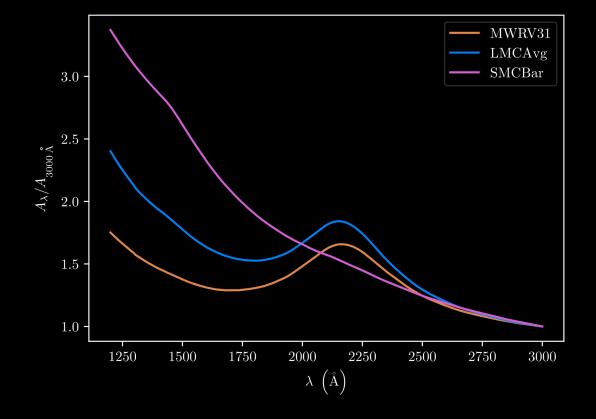
UV more sensitive to dust than optical/NIR.

 $\Rightarrow$  UVEX will help most in low-extinction regions.

# Variation in dust properties

## **Dust extinction curves (with photometry)**

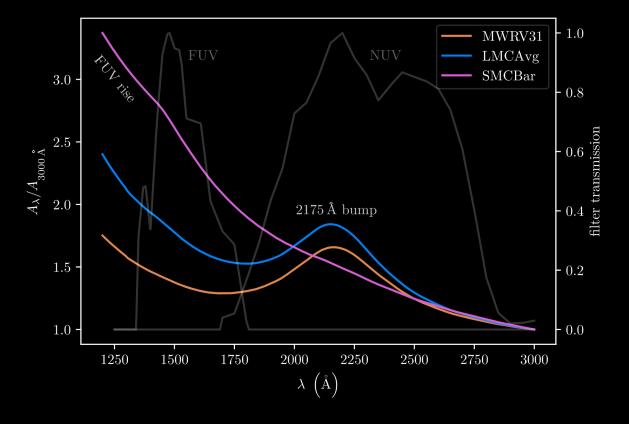
Extinction vs. wavelength varies with environment.



### **Dust extinction curves (with photometry)**

Extinction vs. wavelength varies with environment.

NUV and FUV bands sensitive to different dust features.



O9V spectrum

 $A_V = 0.0, \ 10.0 \text{ Å smoothing}$  $F_{\lambda}$ 12501500175020002250250027503000 $\lambda$  (Å)

O9V, S/N = 10

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O9V spectrum

... behind 0.5 mag of V-band extinction

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**O9V** spectrum

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Photometric metallicities

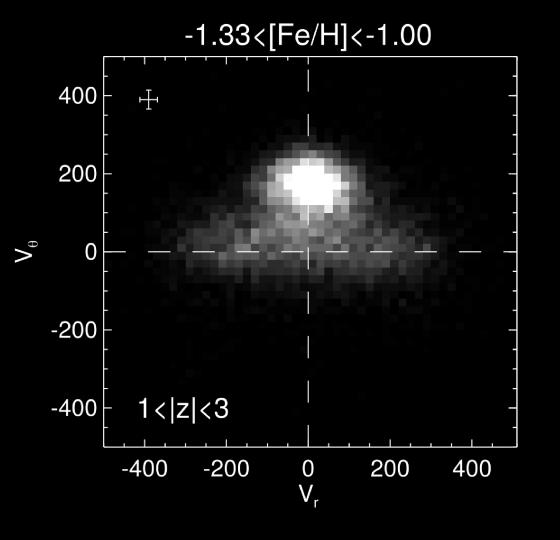
### Metallicity as a key to understanding galaxy formation history

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Highly radial population of stars identified in kinematic & metallicity space.

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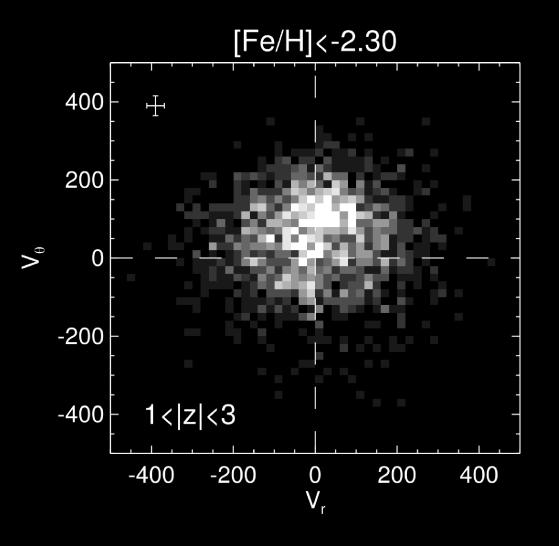


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(Belokurov *et al.* 2018)

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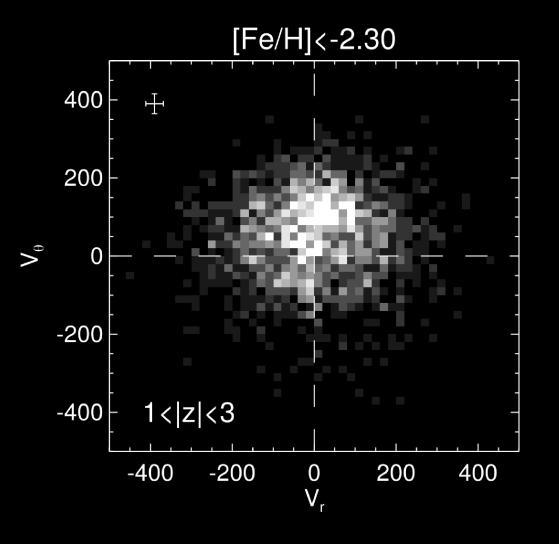


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UV excess method

## UV excess method

At fixed optical color, UV color correlates with metallicity.

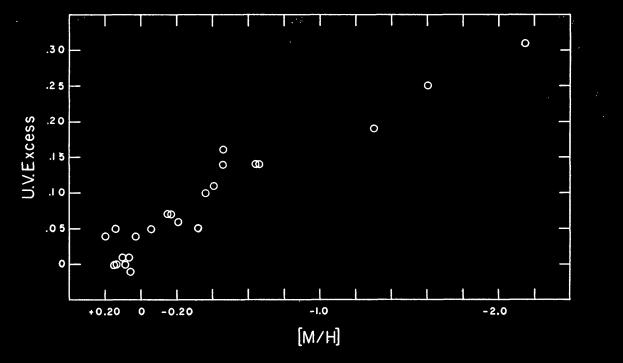


FIG. 1.—The metal deficiency plotted against ultraviolet excess for late F and early G dwarfs

(Wallerstein & Carlson 1960)

## UV excess method

At fixed optical color, UV color correlates with metallicity.

UV line blanketing: more metals ⇒ fainter UV.

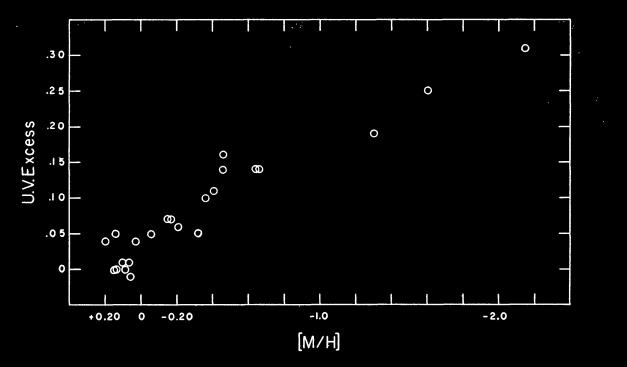
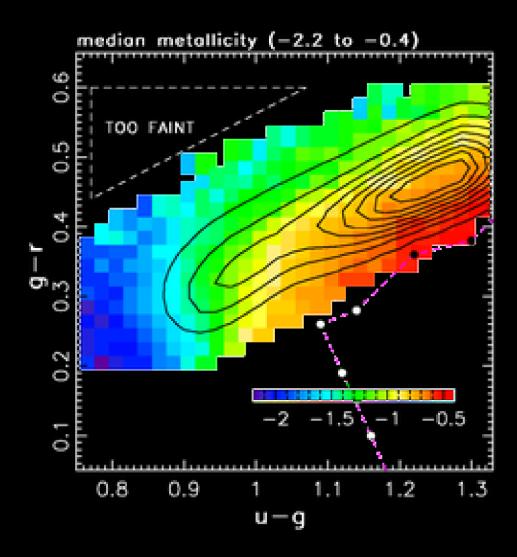


FIG. 1.—The metal deficiency plotted against ultraviolet excess for late F and early G dwarfs

(Wallerstein & Carlson 1960)

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Measured [Fe/H] of ~2 million stars using u-g color excess at fixed g-r.

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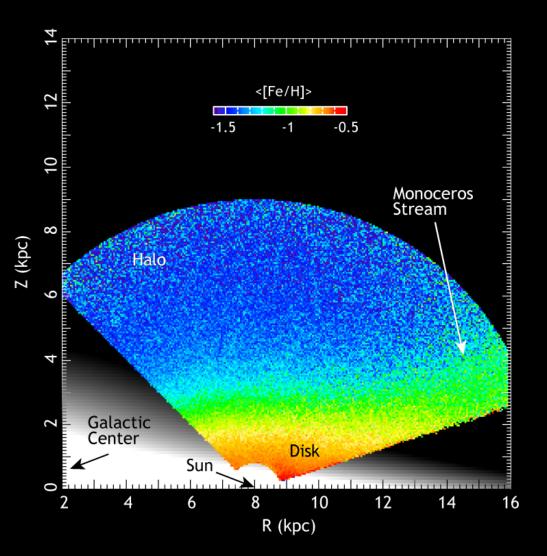
Compared to spectroscopy: larger uncertainties, more stars.

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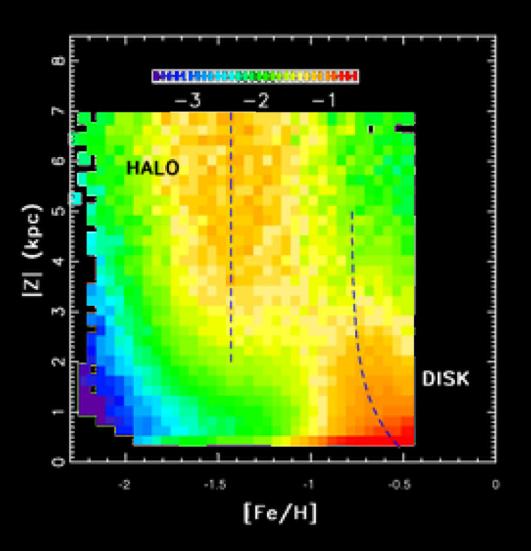


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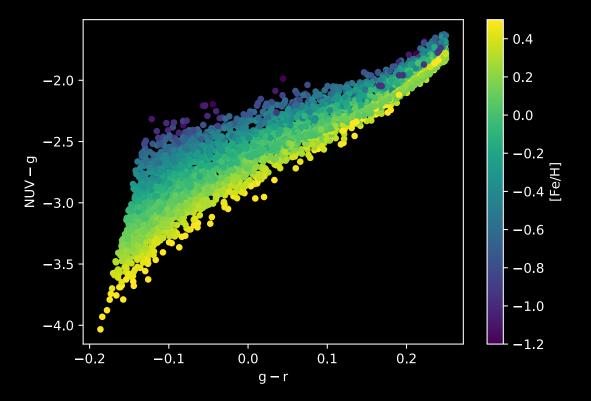
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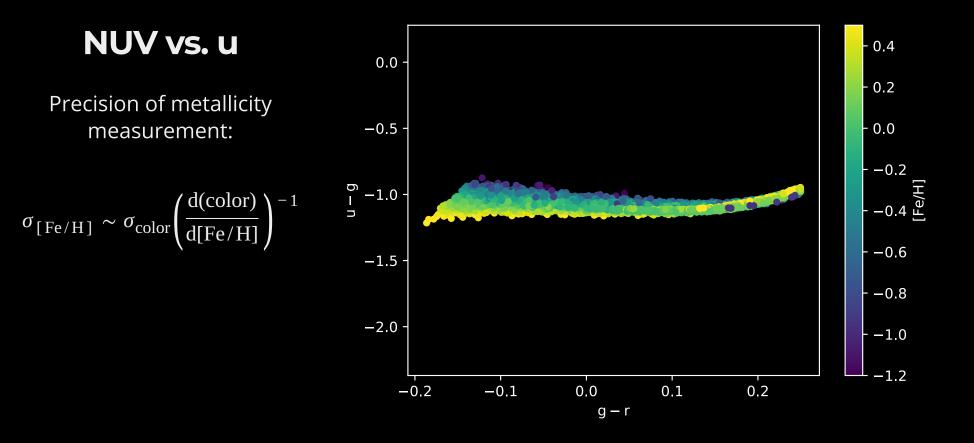


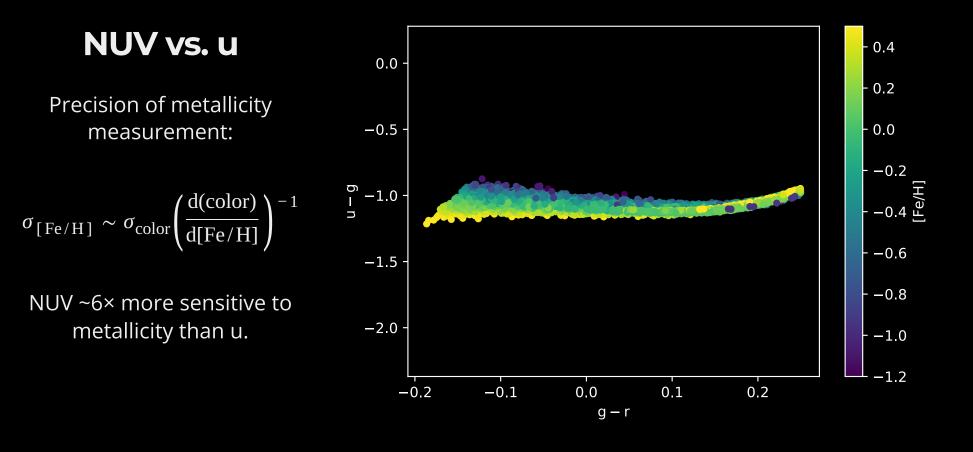


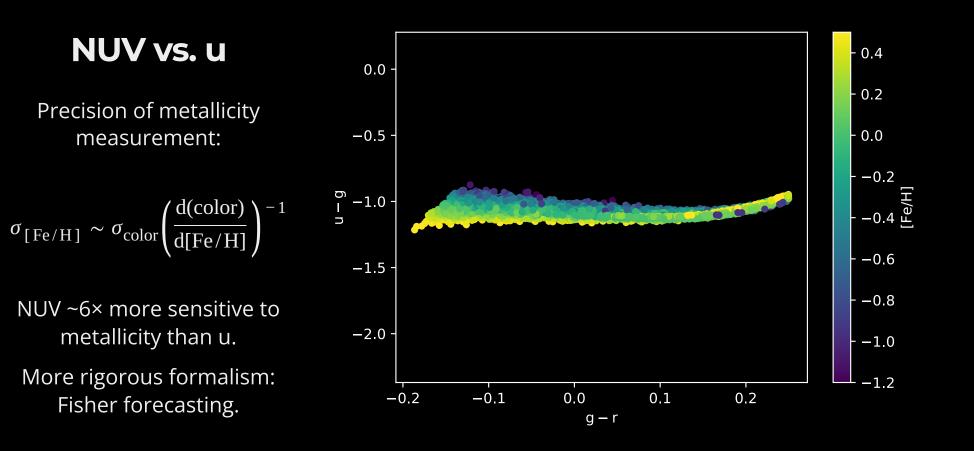
Precision of metallicity measurement:

$$\sigma_{
m [Fe/H]} \sim \sigma_{
m color} igg( rac{{
m d}\,({
m color})}{{
m d}\,[{
m Fe/H}]} igg)^{-1}$$









### **Fisher forecasting**

$$rac{1}{\sigma_{
m [Fe/H]}^2} \sim rac{1}{\sigma_{
m color}^2} igg( rac{{
m d}\,({
m color})}{{
m d}\,[{
m Fe}/{
m H}]} igg)^2$$

### **Fisher forecasting**

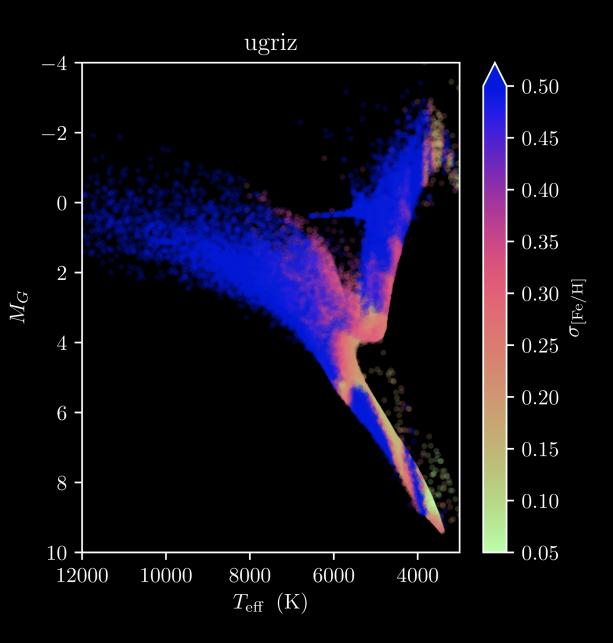
$$\frac{1}{\sigma_{[Fe/H]}^2} \sim \frac{1}{\sigma_{color}^2} \left(\frac{d(color)}{d[Fe/H]}\right)^2$$

$$\Sigma_{\text{stellar params}}^{-1} \sim \left(\frac{\partial(\text{colors})}{\partial(\text{stellar params})}\right)^T \Sigma_{\text{colors}}^{-1} \left(\frac{\partial(\text{colors})}{\partial(\text{stellar params})}\right)^T$$

### [Fe/H] precision

Typical metallicity precision across the HRD, using:

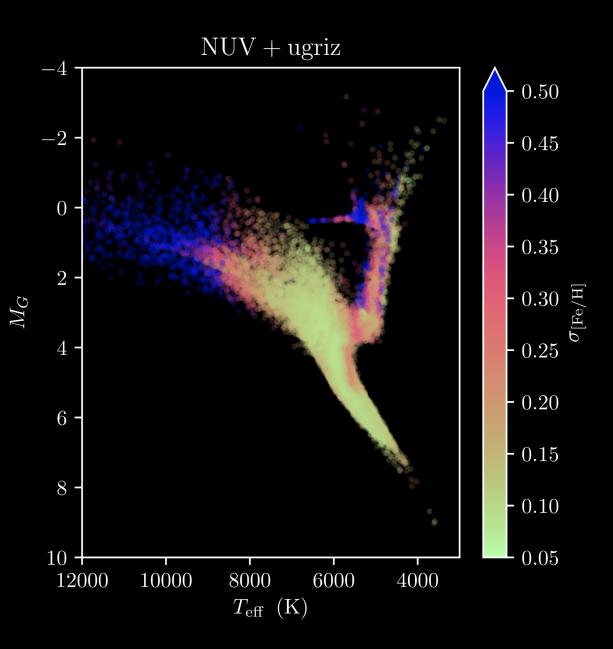
LSST



### [Fe/H] precision

Typical metallicity precision across the HRD, using:

LSST + NUV



#### FUV + NUV + ugriz-4 0.50-20.450.400 0.3520.30 $M_G$ 0.2540.206 -0.158 0.1010 +0.056000 400012000100008000 $T_{\rm eff}$ (K)

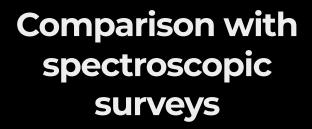
H/

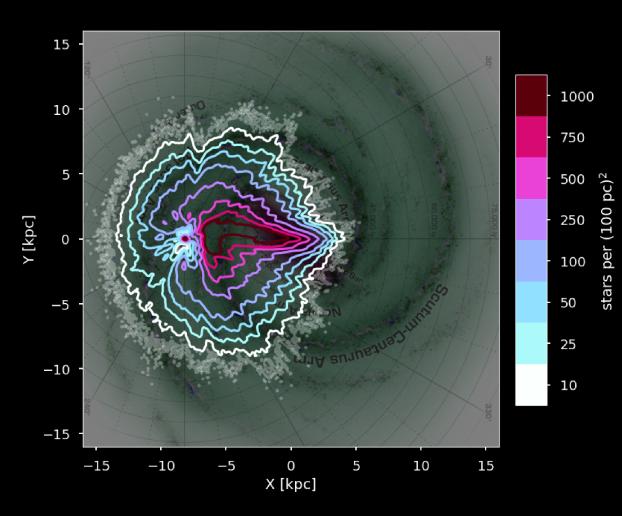
Fe/

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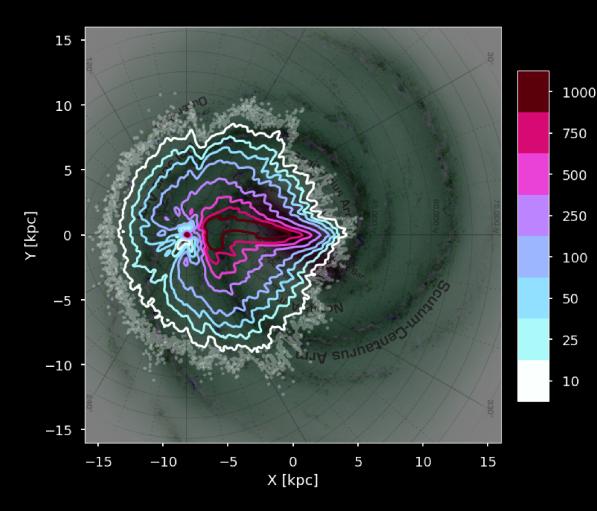
Typical metallicity precision across the HRD, using:

LSST + NUV + FUV





(Kollmeier *et al.* 2017)



#### Comparison with spectroscopic surveys

SDSS-V Galactic Genesis: ~6×10<sup>6</sup> high-resolution NIR spectra.

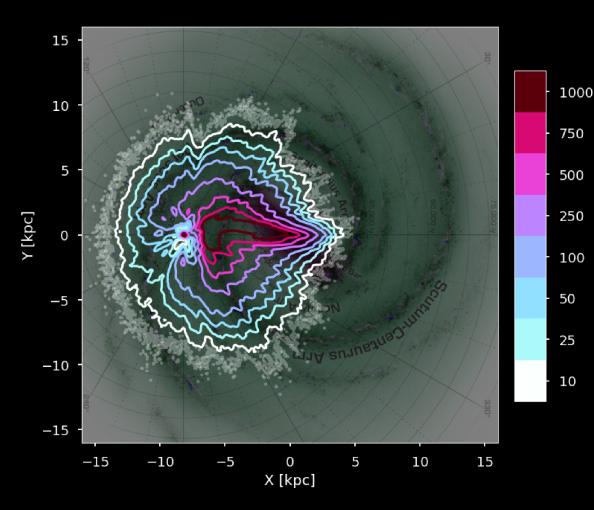
pc)<sup>2</sup>

(100)

per

stars

(Kollmeier *et al.* 2017)



### Comparison with spectroscopic surveys

SDSS-V Galactic Genesis: ~6×10<sup>6</sup> high-resolution NIR spectra.

pc)<sup>2</sup>

(100

per

stars

UVEX NUV + LSST (South) or PS1 (North): ~300 million stars.

(Kollmeier *et al.* 2017)

# Stellar models

### **Empirical stellar models**

Accurate stellar photometric & spectral models required.

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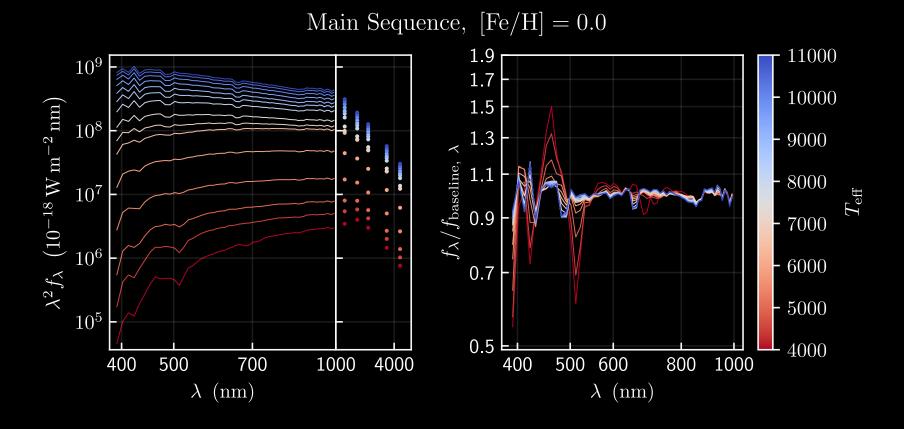
Accurate stellar photometric & spectral models required.

Small fraction of stars have high-resolution spectroscopy.

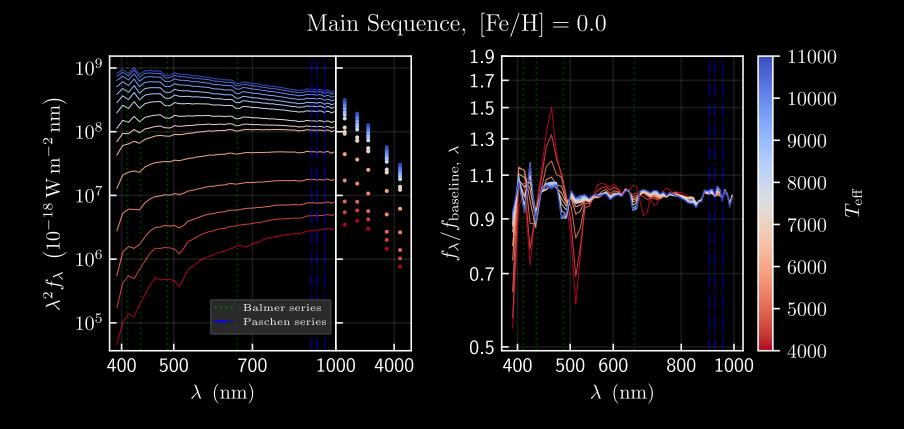
### **Empirical stellar models**

Accurate stellar photometric & spectral models required. Small fraction of stars have high-resolution spectroscopy.  $\Rightarrow$  "Learn" empirical stellar model.

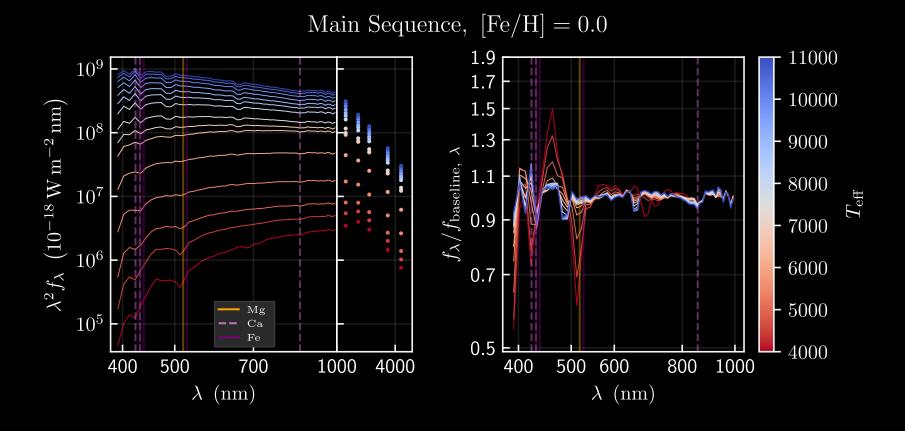
#### Learned stellar models of Gaia XP spectra



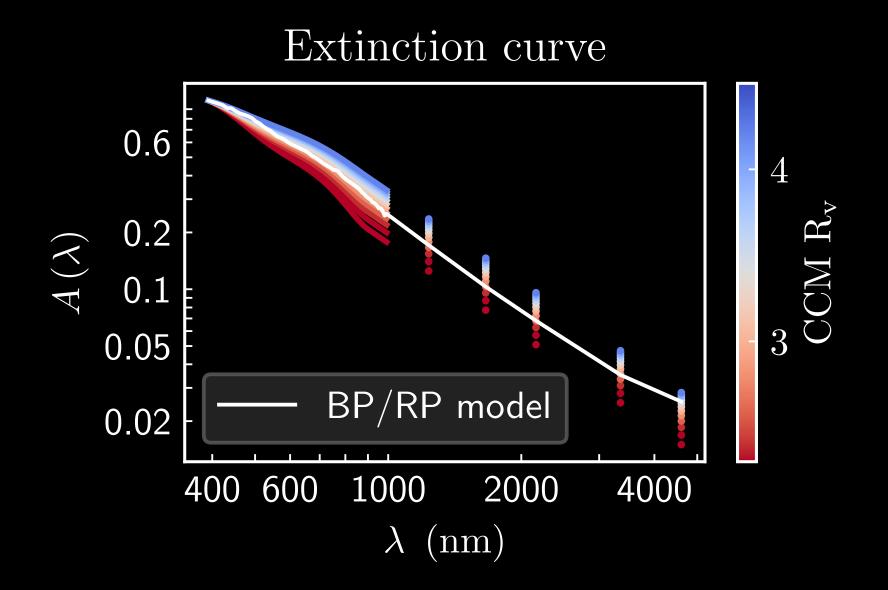
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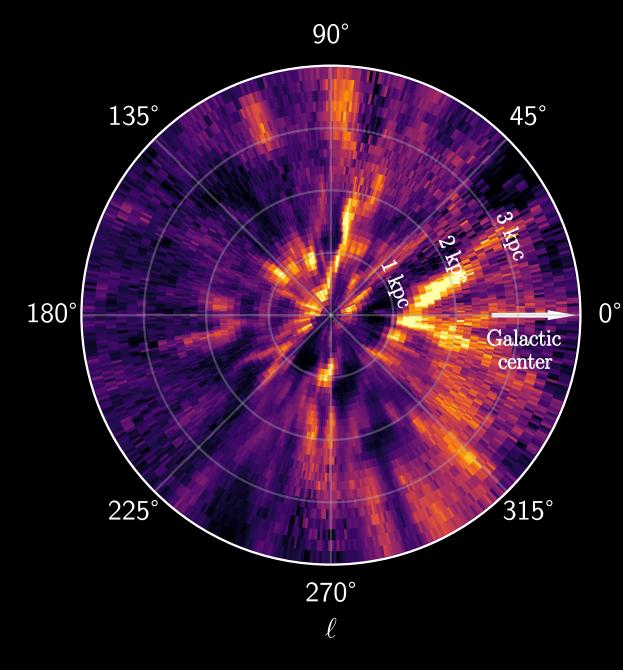


#### Learned stellar models of Gaia XP spectra



#### Learned extinction curve





#### 3D dust map based on 220 million Gaia XP spectra

Uses empirical model learned from the 1% of data with LAMOST spectra.

Dust maps: high sensitivity at low extinction.

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Variation in dust extinction curve.

Dust maps: high sensitivity at low extinction. Variation in dust extinction curve. Photometric metallicities of ~300 million stars using UV excess.