



Precise Stellar Parameters for 10,000+ APOGEE M dwarfs

Jessica Birky (UCSD/MPIA), David W. Hogg (NYU/MPIA/Flatiron), Andrew Mann (UNC), Adam Burgasser (UCSD)

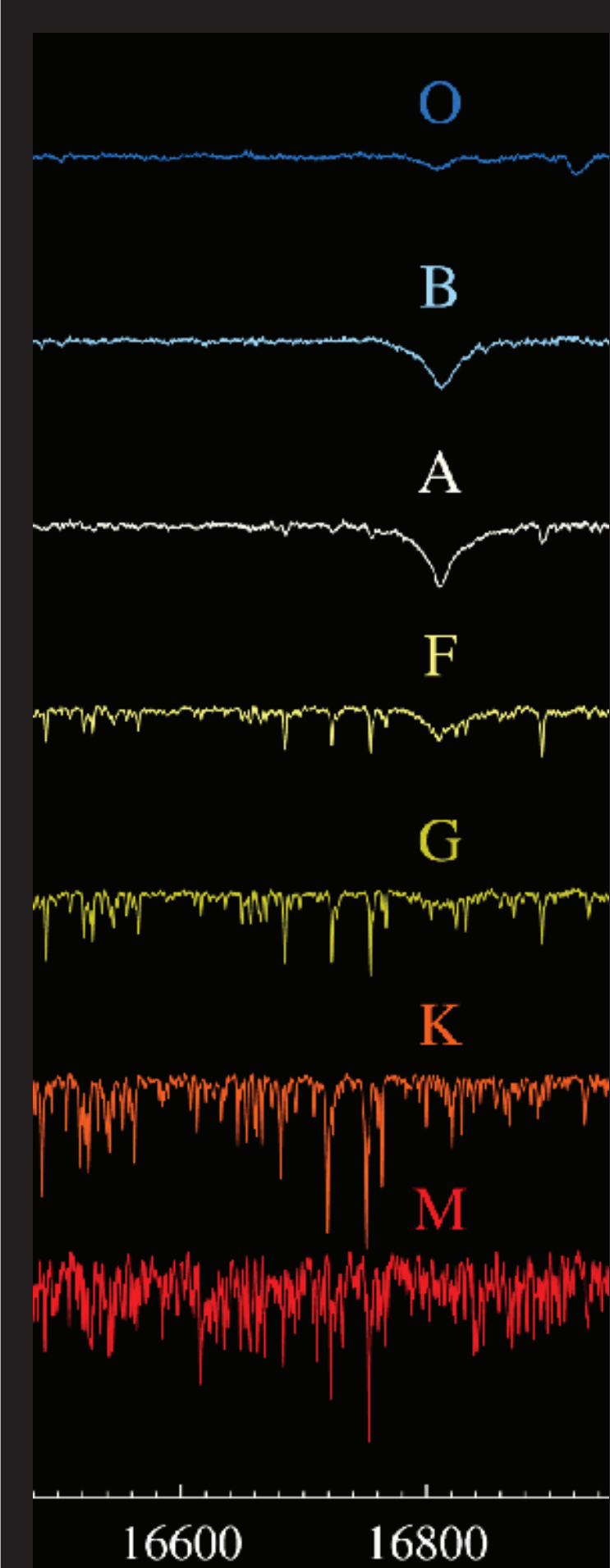
Overview

Motivation: M dwarfs which are atmospheric temperatures of 2500-4200K make up ~70% of the galaxy [3] and have lifespans over 10^{12} yrs [8] making them unique probes of **galactic structure & evolution** [3]. Low masses, small radii and short orbital periods facilitate easier detection of their **exoplanets** by radial velocity and transit methods [13,2].

Data: The Apache Point Observatory Galactic Evolution (APOGEE) survey [9]: >250,000 stars, 1.5 - 1.7 μm , $R \sim 22,500$, primarily targeting bright, giant sources.

Challenge: Numerous blended features \rightarrow difficult to deconvolve & measure equivalent widths of individual lines [12]. Atmospheric models limited by incomplete line lists & opacities [1].

Objective: Extract precise atmospheric parameters (**temperatures** and **metallicity** abundances) from high-res M dwarf spectra using **data-driven models**.

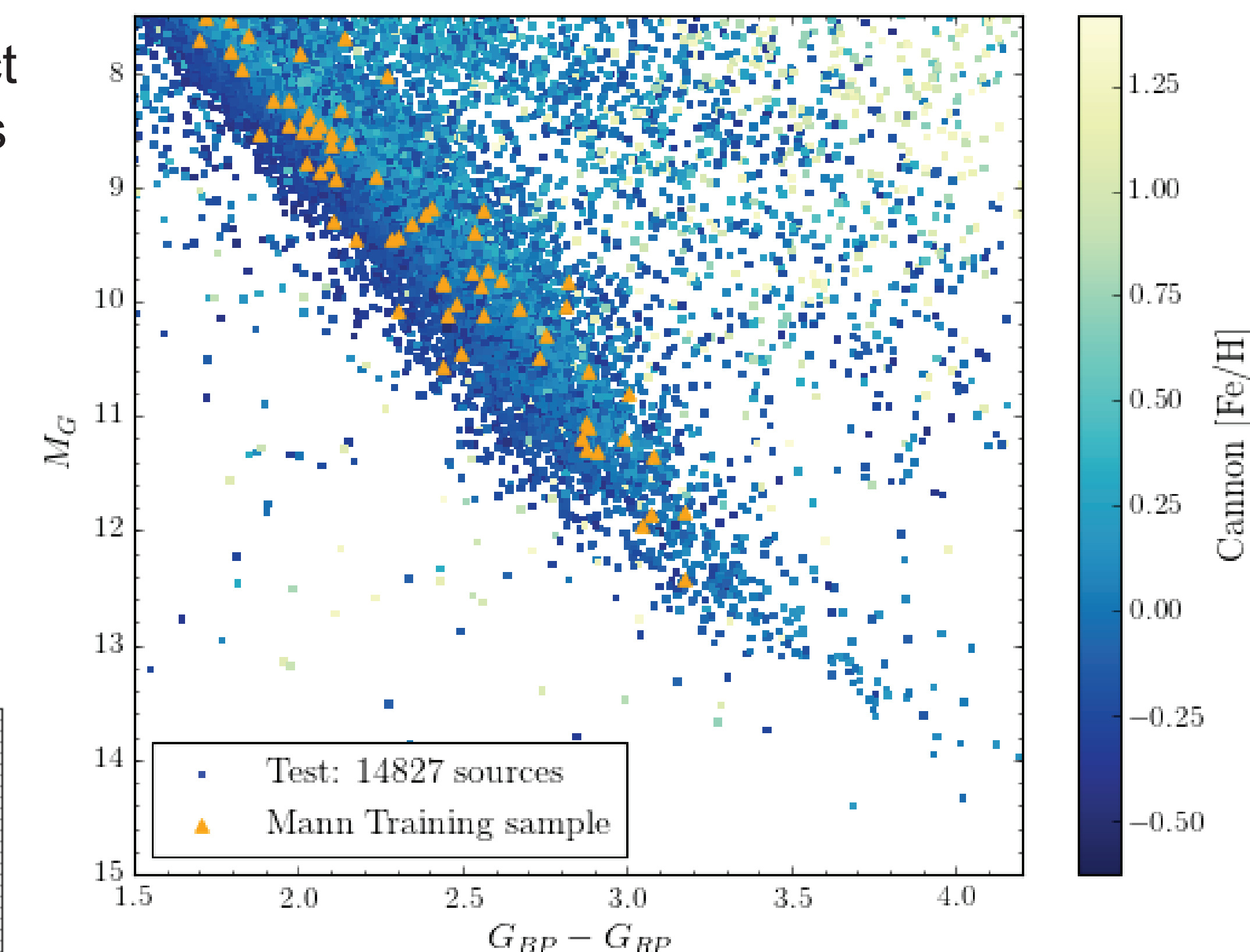
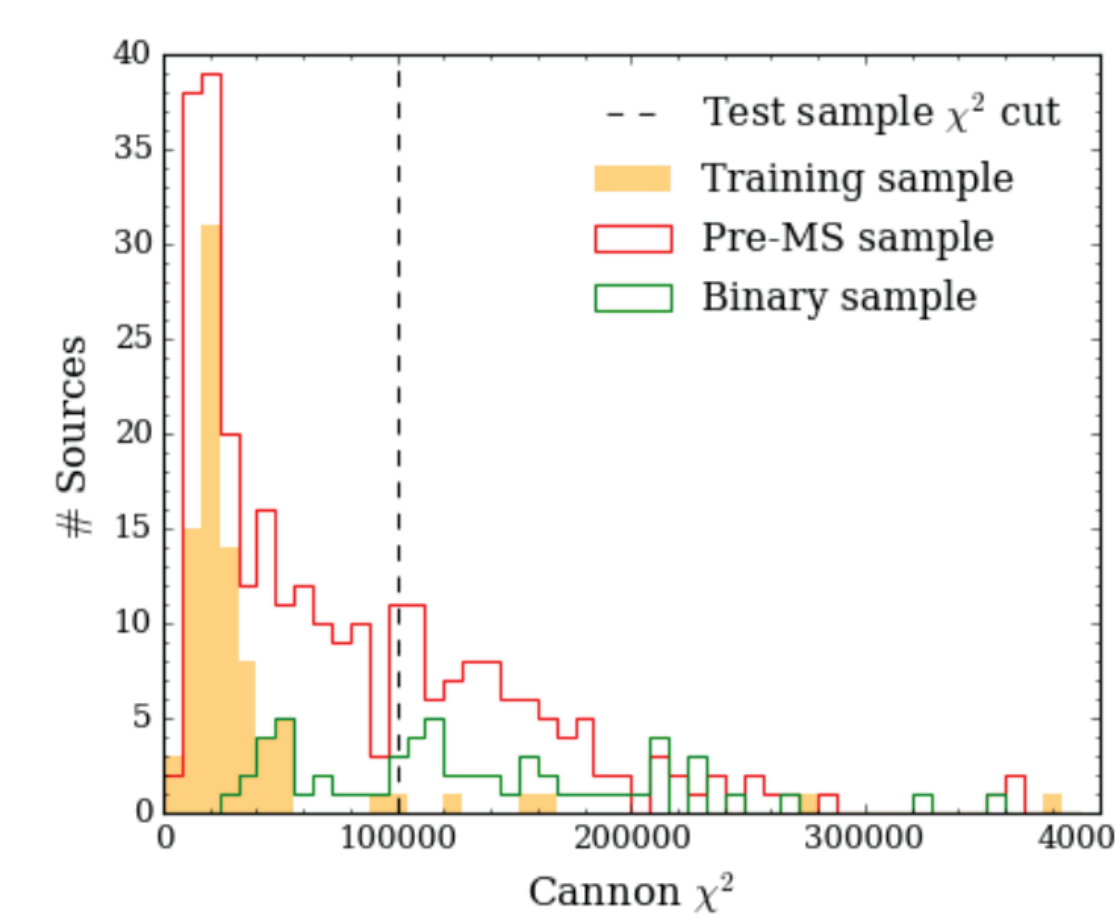


Methods & Sample Selection

Method: Using **The Cannon** [11] framework, we construct a regression model for predicting the flux at each pixel as a function of **stellar labels**. This method employs no line lists & effectively transfers labels from a training sample with known labels to a test sample.

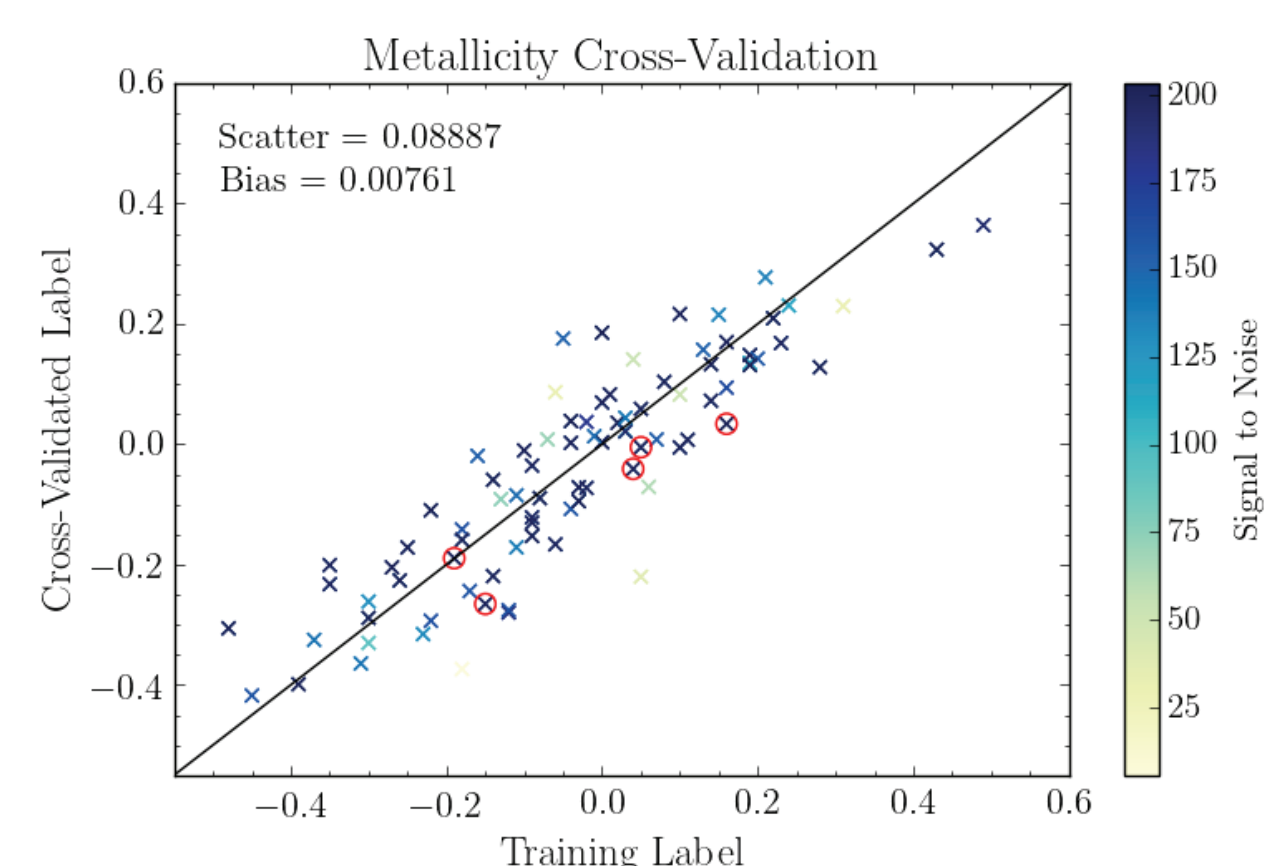
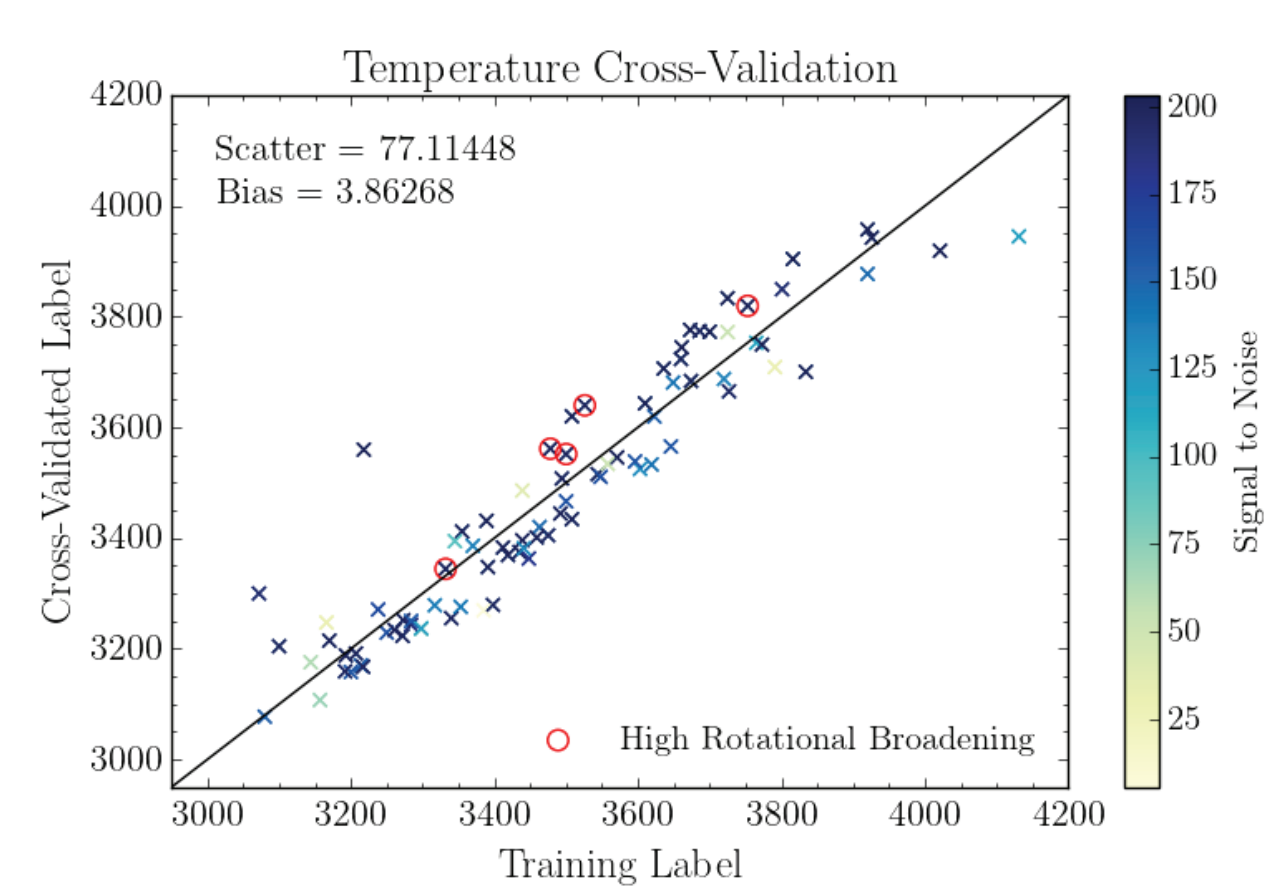
Training Sample: **89 sources** with calibrated temperature & metallicity measurements from Mann et al. 2015, spanning $2850 < T_{\text{eff}} < 4200\text{K}$ and $-0.5 < [\text{Fe}/\text{H}] < 0.5$

Test Sample: Using 2MASS/Gaia CMD cuts and Cannon model fits, we minimize pre-main sequence, K dwarf & subdwarf sources resulting in a sample of **10,311 M dwarfs**.

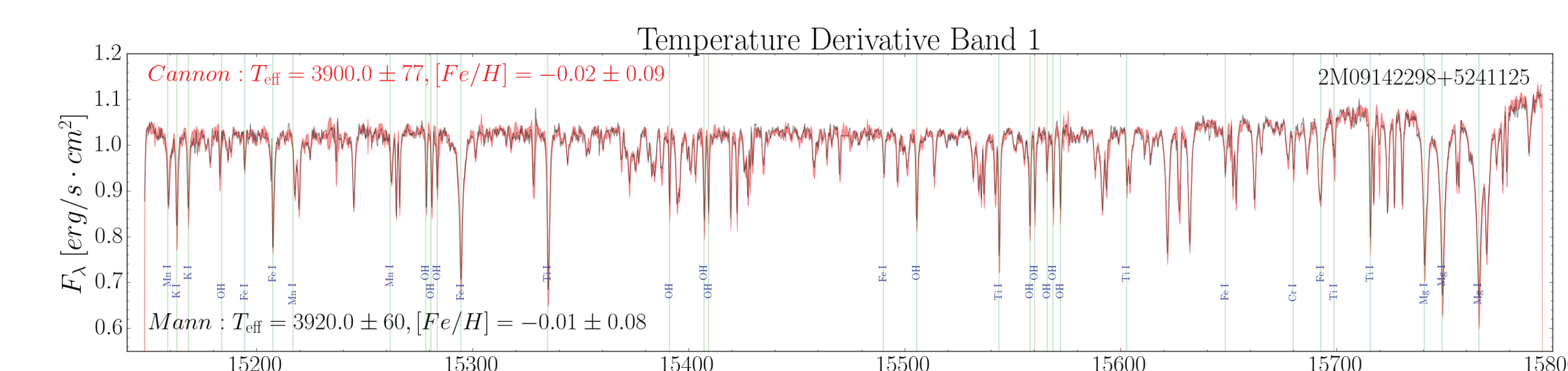


Color-magnitude diagram (CMD) of 14,827 sources selected from the APOGEE-Gaia cross-match. Overplotted in orange are the 89 training sources.

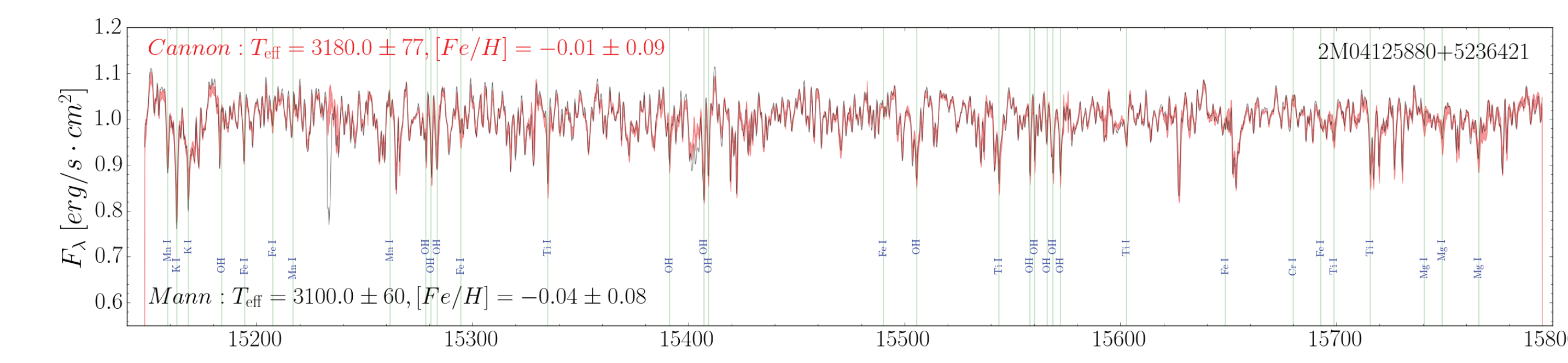
Data-Driven Models



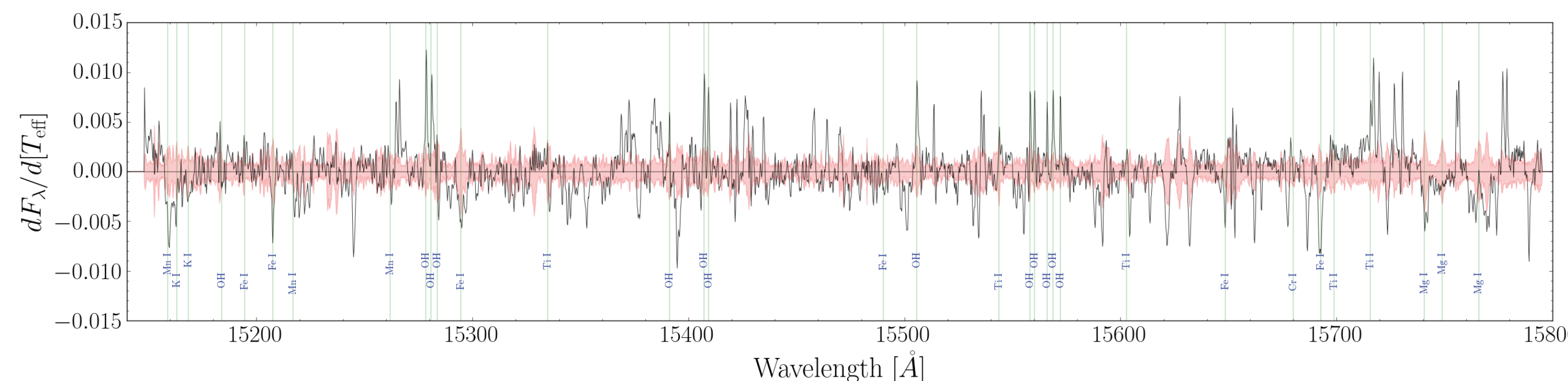
Training labels compared to the Cannon model cross-validated labels.



[P1]



[P2]



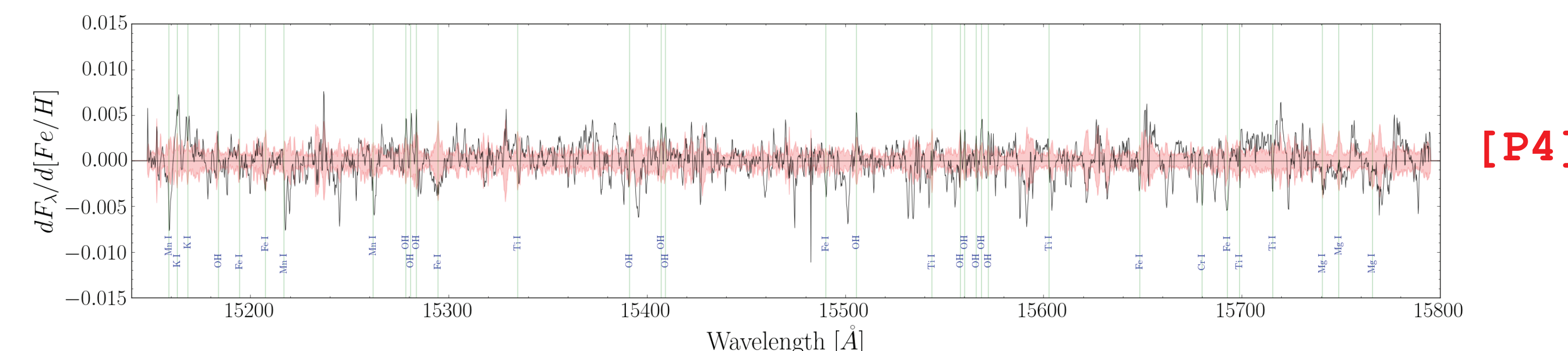
[P3]

How does our model extract information?

Panels [P1] and [P2] demonstrate our model fits for two sources different temperatures and near solar metallicities for the 1.51-1.58 μm band spectrum. Overplotted are atomic and molecular lines identified by [12].

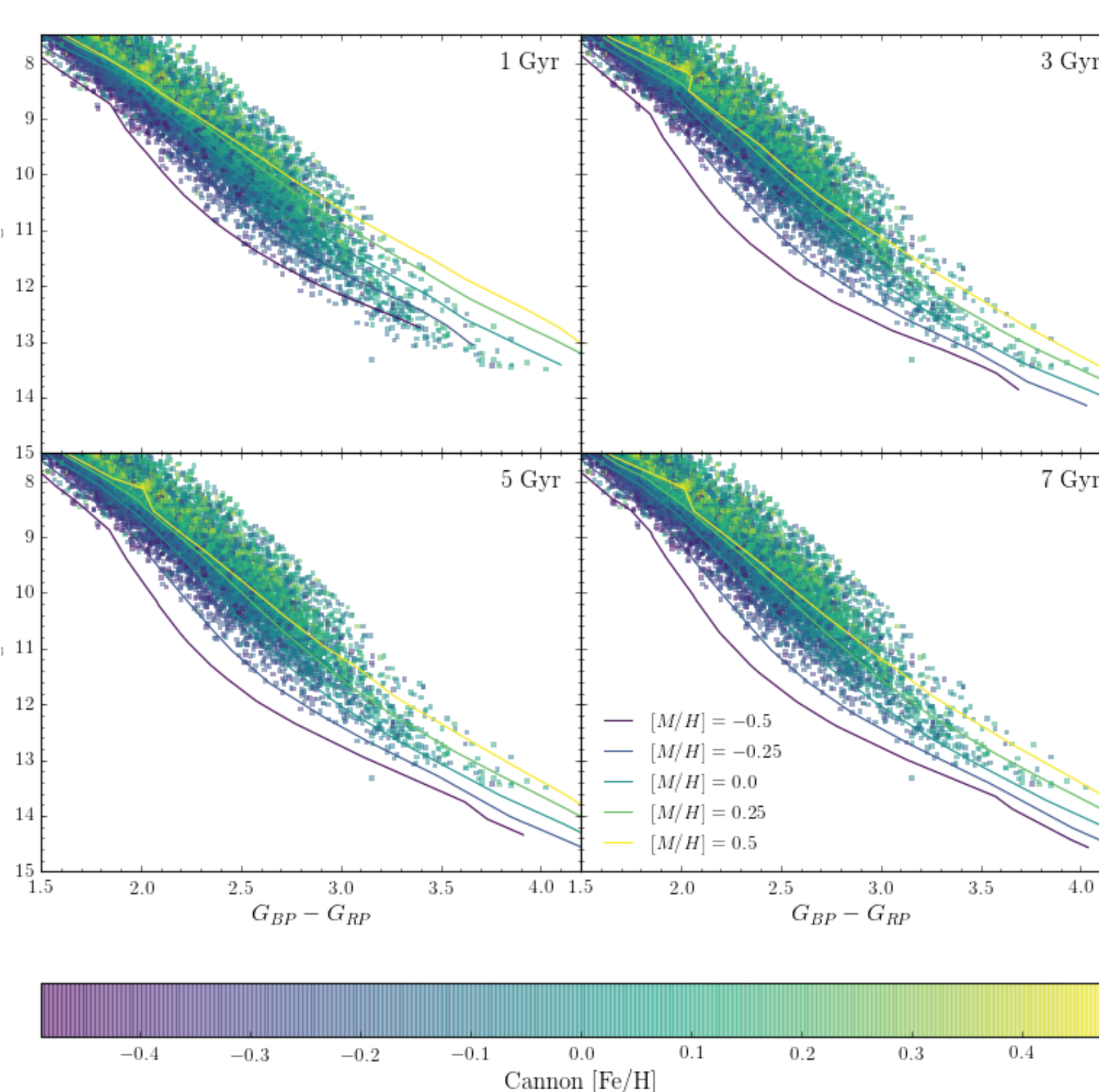
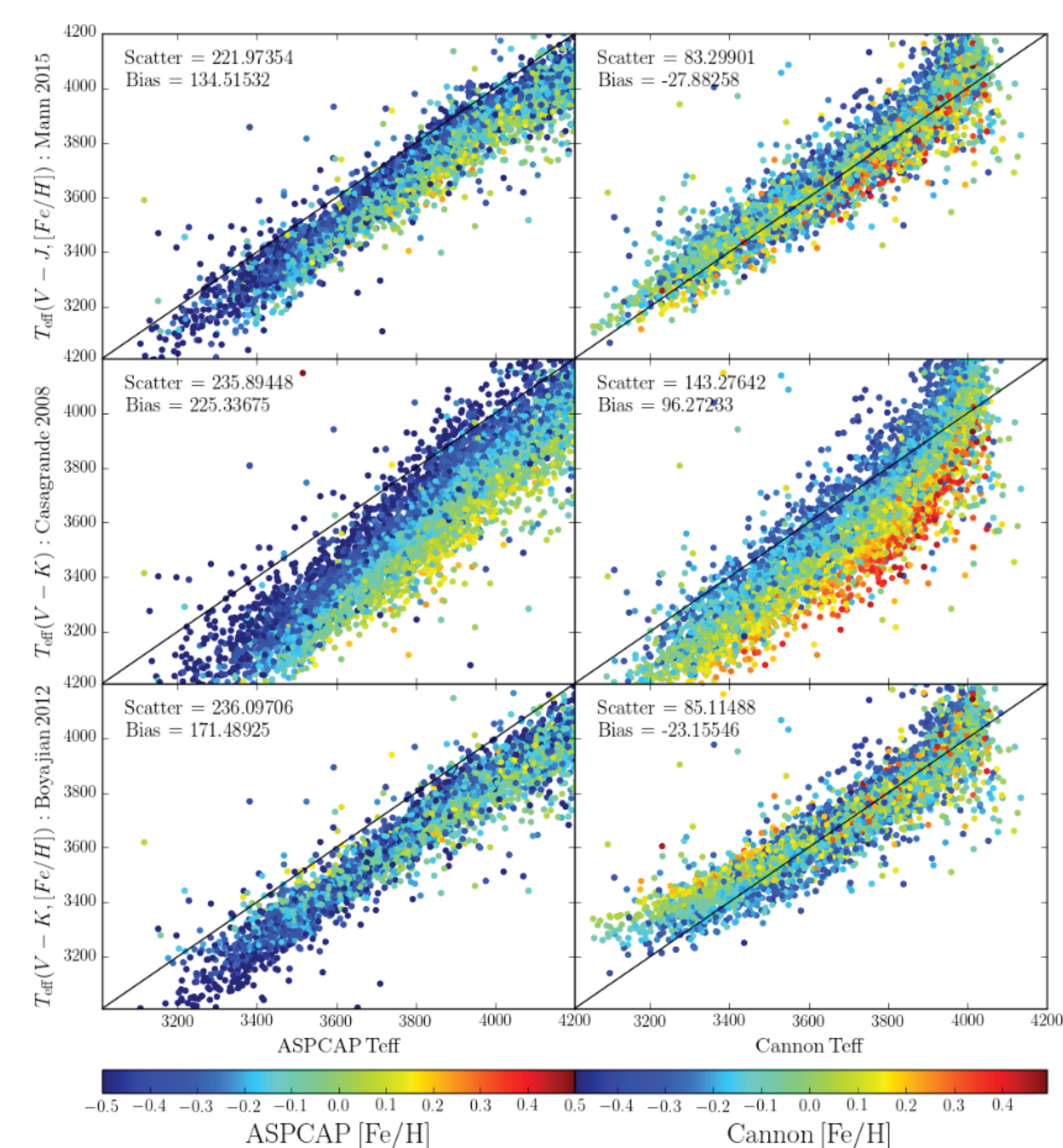
[P3] shows the derivative of our model with respect to temperature and [P4] the derivative with respect to metallicity. A 1- σ jackknife error interval is overplotted in red, indicating which features significantly contribute to the model.

Our model finds OH, Mn I, Fe I, FeH, Si I lines to be the strongest indicators of temperature. In our [Fe/H] derivative we find less significant metallicity indicators (OH, Fe I, Mn I, Si I), and an insignificant correlation with FeH lines, indicating our model may be picking up low-level metallicity information from many weak lines.



[P4]

Parameter Validation



Gaia color-magnitude diagram, colored by Cannon metallicities. Overplotted are PARSEC isochrones [5] at varying metallicities and ages. Note the binary sequence on upper slice of main sequence.

Temperatures from the ASCAP pipeline [7] (left) and The Cannon (right), each compared to three color-temperature relations [4,6,10]. Cannon temperatures agree within ~85K.

Take-Aways

Large samples of M dwarf physical parameters are useful for constraining exoplanet conditions and tracing galactic structure in kinematics. Our sample contains T_{eff} , [Fe/H], Masses, Radii, 6D kinematics.

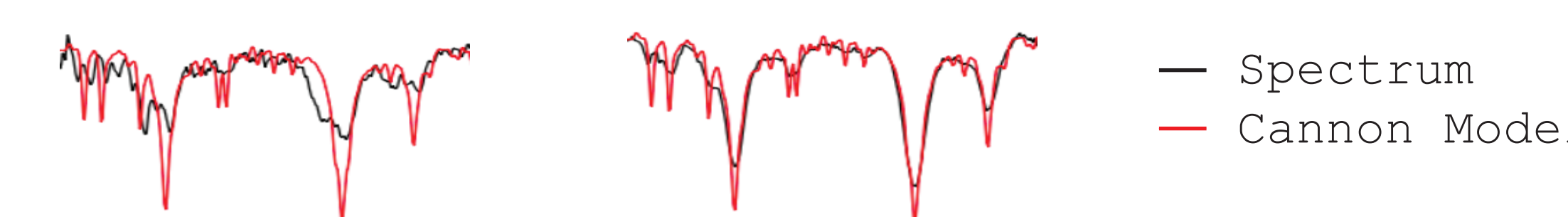
The data-driven modeling approach circumvents the challenge of incomplete line lists in theoretical models + we identify T_{eff} & [Fe/H] sensitive indices.

Our data-driven model achieves very high **temperature/metallicity** precisions of **77K/0.09 dex**. Models is accurate in the spectral domain to ~1%.

Stay tuned for our paper **Birky et al. (In prep)!**

Future Work

Model improvements:



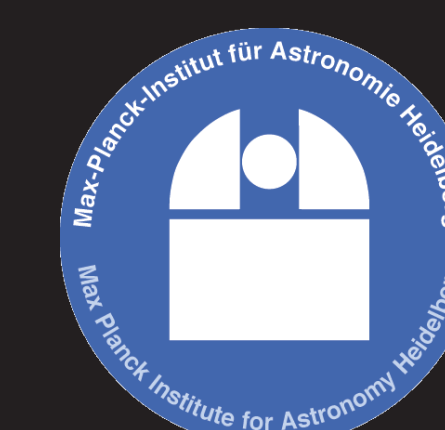
Spectroscopic Binaries Rapid Rotators
Search for spectral indicators of magnetic activity?

Applications:

Spectral models of other surveys (2,748 LAMOST sources).
Properties of exoplanet hosts (4,586 TESS sources).
Color-magnitude-temperature-metallicity relations.

[1] Allard, F., et al. 2013, Memorie della Soc. Astro., 24, 128
[2] Ballard, S. 2018, arXiv:1801.04949
[3] Bochanski, J. J. et al. 2010, AJ, 139, 2679
[4] Boyajian, T. S. et al. 2012, ApJ, 757, 112
[5] Bressan, A., et al. 2012, MNRAS, 427, 127
[6] Casagrande, L. et al. 2008, MNRAS, 389, 585

[7] Garcia Pérez, et al. 2016, AJ, 151, 144
[8] Laughlin, G., et al. 1997, ApJ, 482, 420
[9] Majewski, S. R. et al. 2015, AJ, 154, 94
[10] Mann, A. W. et al. 2015, ApJ, 804, 64
[11] Ness, M. et al. 2015, ApJ, 808, 16
[12] Souto, D. et al. 2017, ApJ, 835, 239
[13] Trifonov et al. 2018, A&A, 609, A117



UC San Diego

Email: jbirky@ucsd.edu

