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Chemical evolution in the context of GALAH: description of methods and preliminary results

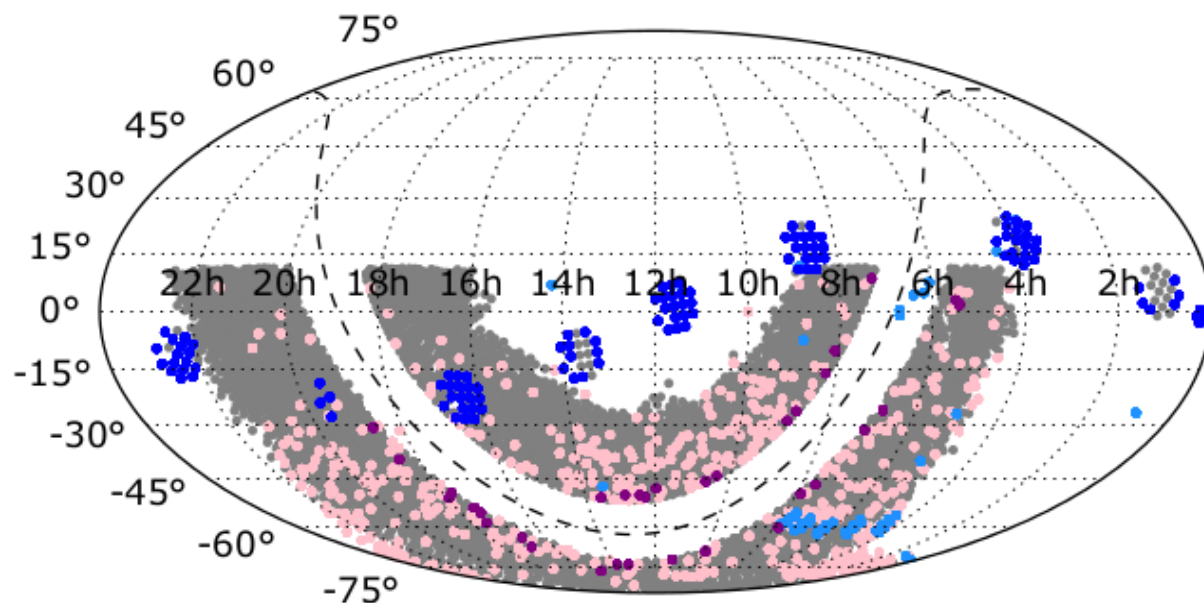
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the GALAH Collaboration

The GALAH Survey

- 1 million stars spectroscopic survey of the Milky Way, primarily targeting the disk.
- Main goal is to use chemical tagging to reconstruct the formation and evolution of the Galaxy.
- Obtaining elemental abundances of 29 elements:

Light elements: Li, C, Alpha elements: O, Mg, Si, Ca, Ti Light odd-Z: Na, Al, K, Iron-peak: Sc, V, Cr, Mn, Fe, Ni, Co, Cu, Zn, s-process: Rb, Sr, Y, Zr, Ru, Ba, La, r-process: Ce, Nd, Eu



Survey progress as of Jan 2016.

Grey= unobserved fields

Pink=observed fields

Purple=Tycho-2 bright stars

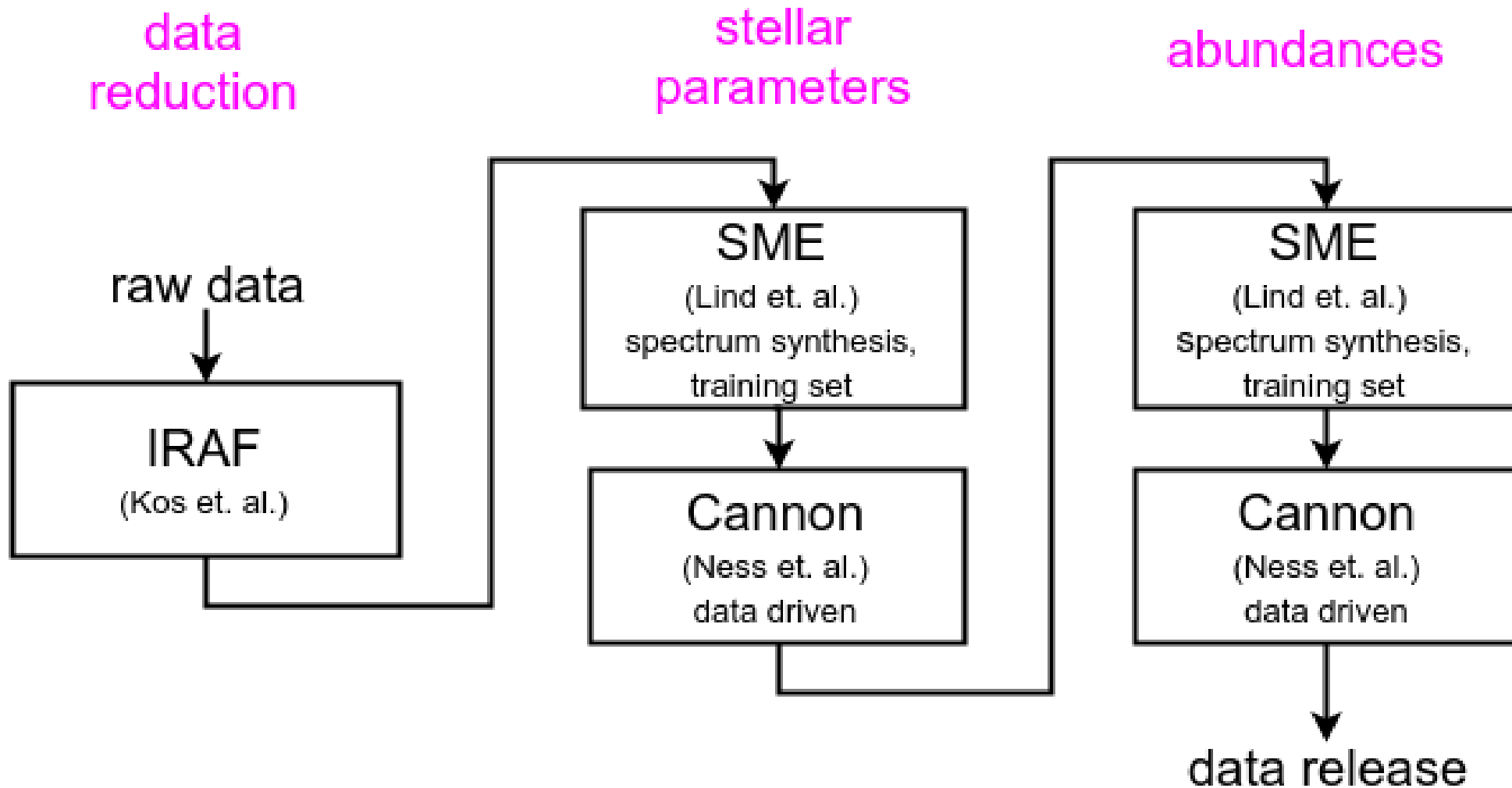
blue=K2-HERMES

Cyan=pilot survey fields

Total= ~250k stars observed

Figure from Martell (2016).

Data flow in GALAH



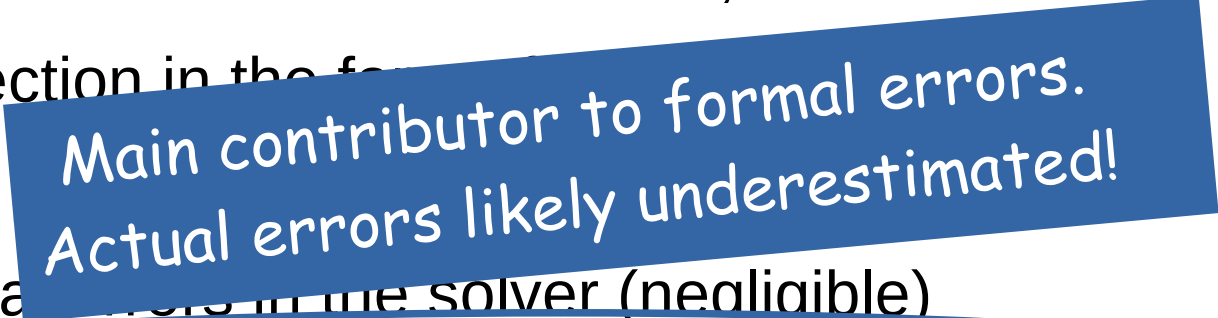
Spectroscopy Made Easy (SME)

(Piskunov & Valenti (2016))

- Solving for: T_{eff} , $\log g$, $[m/H]$, v_{sini} , micro/macro turbulence, radial velocity (RV) and elemental abundances. Steps:
 - 1) Spectral masking- only informative regions are retained.
 - 2) Initial synthesis to determine RV and continuum.
 - 3) Solving for global stellar parameters (e.g. T_{eff} , $\log g$, $[m/H]$)
 - 4) Solving for individual abundances, with fixed stellar parameters.
- NLTE correction in the form of departure coefficients.
- Sources of parameter uncertainties:
 - 1) Numerical errors in the solver (negligible)
 - 2) Measurement errors in observations (quality dependent)
 - 3) Physical errors from models (NLTE, poor atomic data etc...)

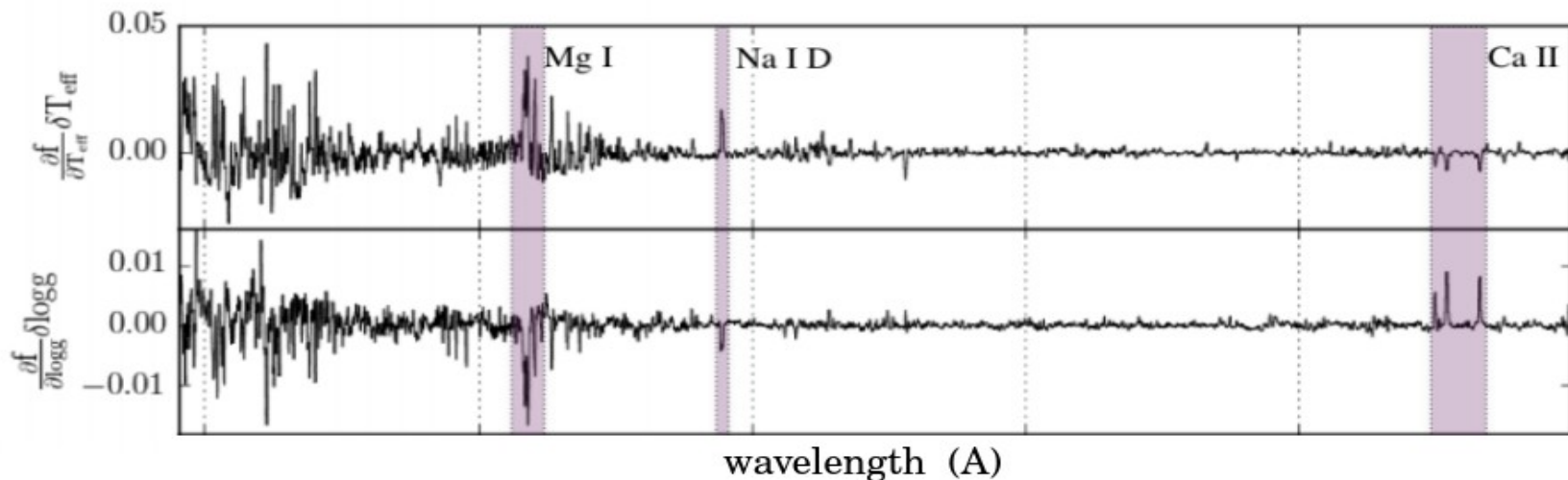
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The Cannon (Ness (2015))

- Data driven model using 'stellar labels' (e.g., stellar parameters):
flux at a certain wavelength can be described as a smooth polynomial function of these labels.
- Two steps: **training step** to generate the functions and **test step** to transfer stellar labels to unknown spectra using generated functions.
- Model independent, relies on an externally robust set of training spectra.
- Quick convergence (<1 second/star compared to 15-30min/star using SME), ideal for large surveys.



Sensitivity of each pixel to stellar labels, as a function of wavelength. Major spectral features correspond to high sensitivity. Figure from Ho (2016).

SME → Cannon training set (stellar parameters)

- Training set of ~2000 stars, high SNR (>50/pixel), TGAS & asteroseismic logg. Good coverage of HR diagram.
- 6 labels from SME: T_{eff} , $\log g$, $[\alpha/\text{Fe}]^*$, $v \sin i$, microturbulence + extinction label from Majewski (2011) & 2MASS/WISE. (*solar scaled, weighted average of Mg, Si and Ti.)
- Lines used for stellar parameters (1D-NLTE (Lind 2012) for Fe, 1D-LTE for rest):

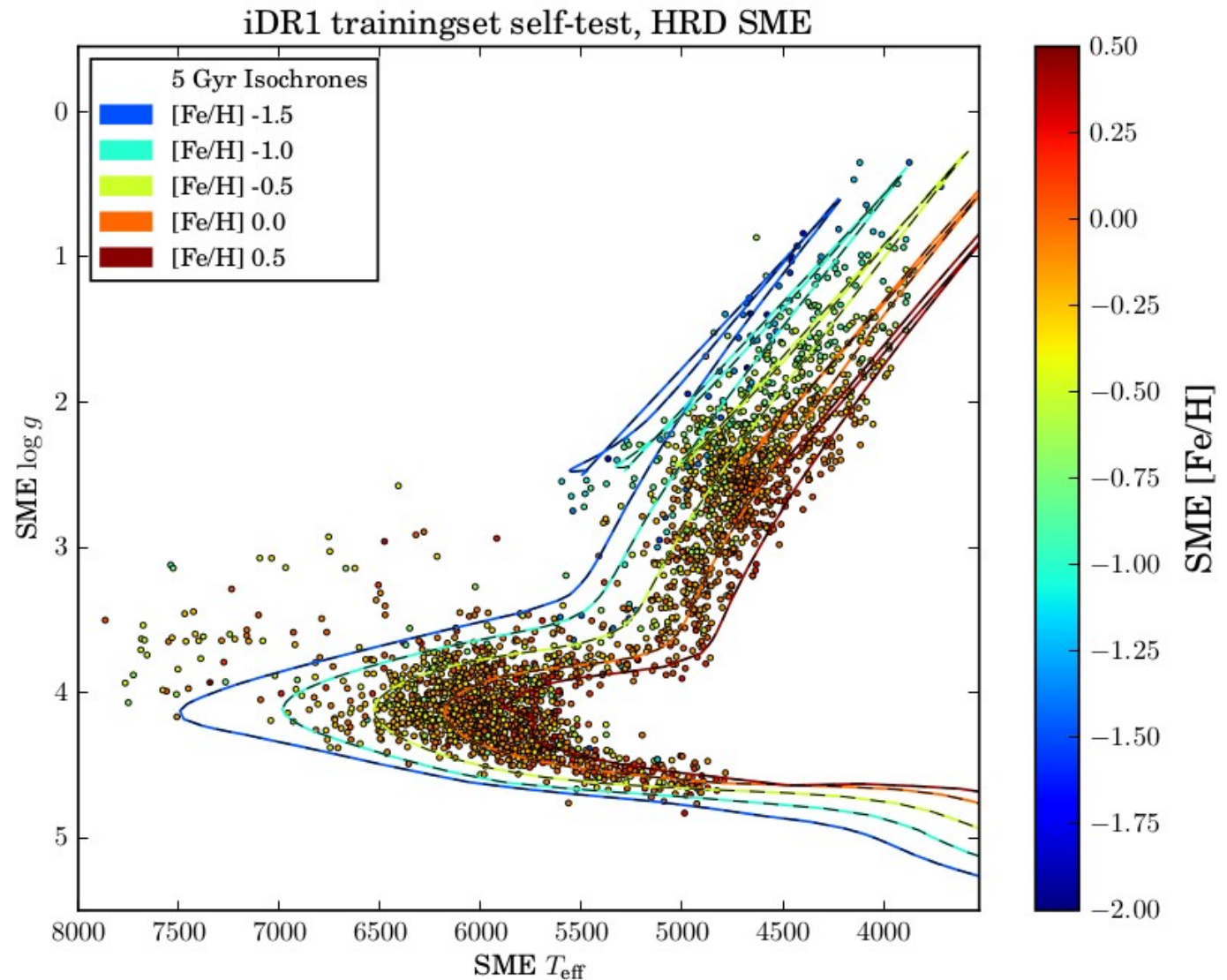
Species	Fe I	Fe II	Ti I	Ti II	Sc I	Sc II	H α	H β
number	52	5	16	6	6	5	1	1

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- 6 labels from SME, microturbulence, 2MASS/WISE, *Journal of Astrophysics*, Jewski (2011) & Mg, Si and Ti.)
- Lines used for Fe, 1D-LTE models to come! (Lind 2012)

1D-NLTE synthesis for more elements & <3D> models to come!

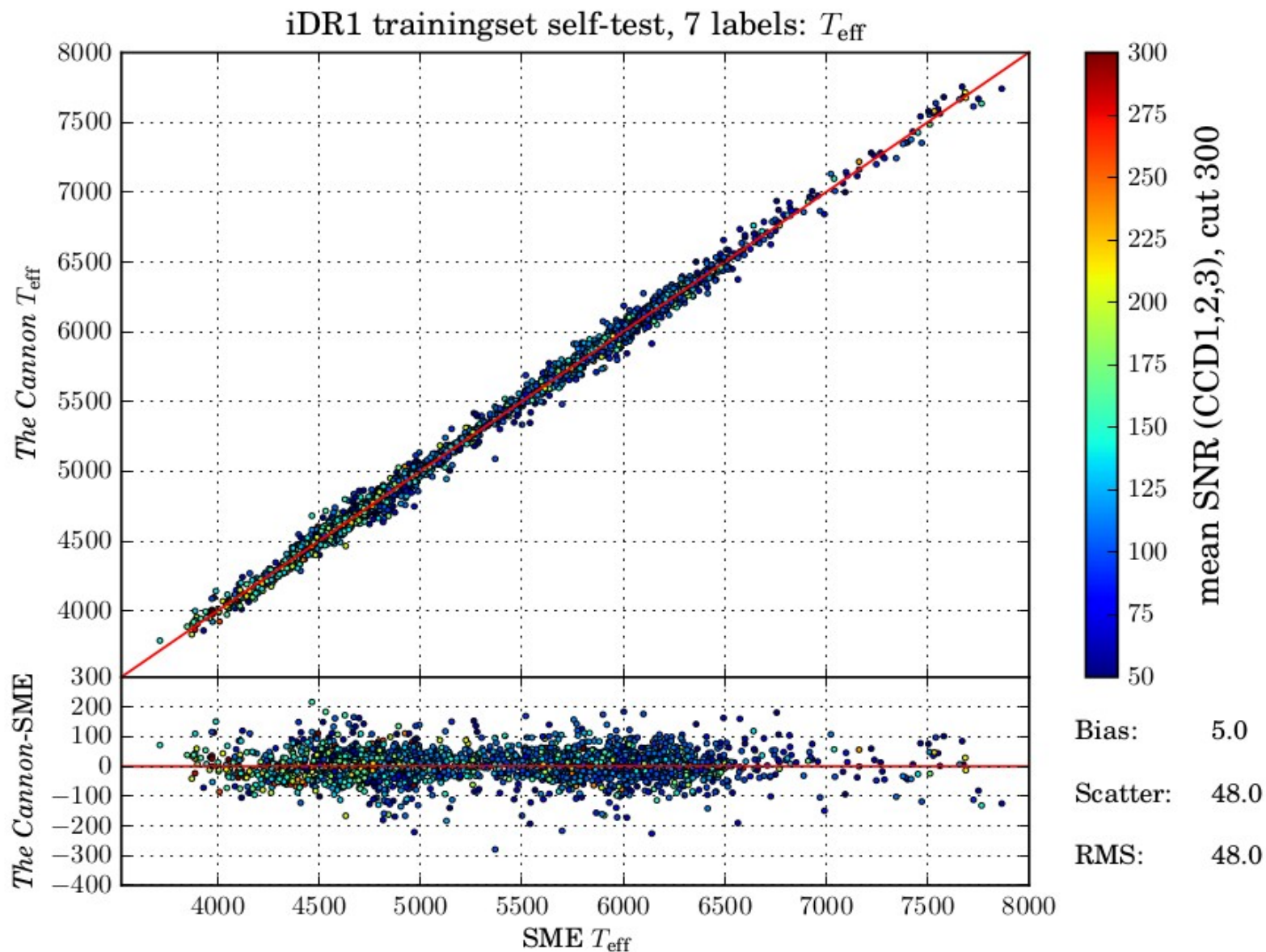
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HR diagram of the Cannon training set.

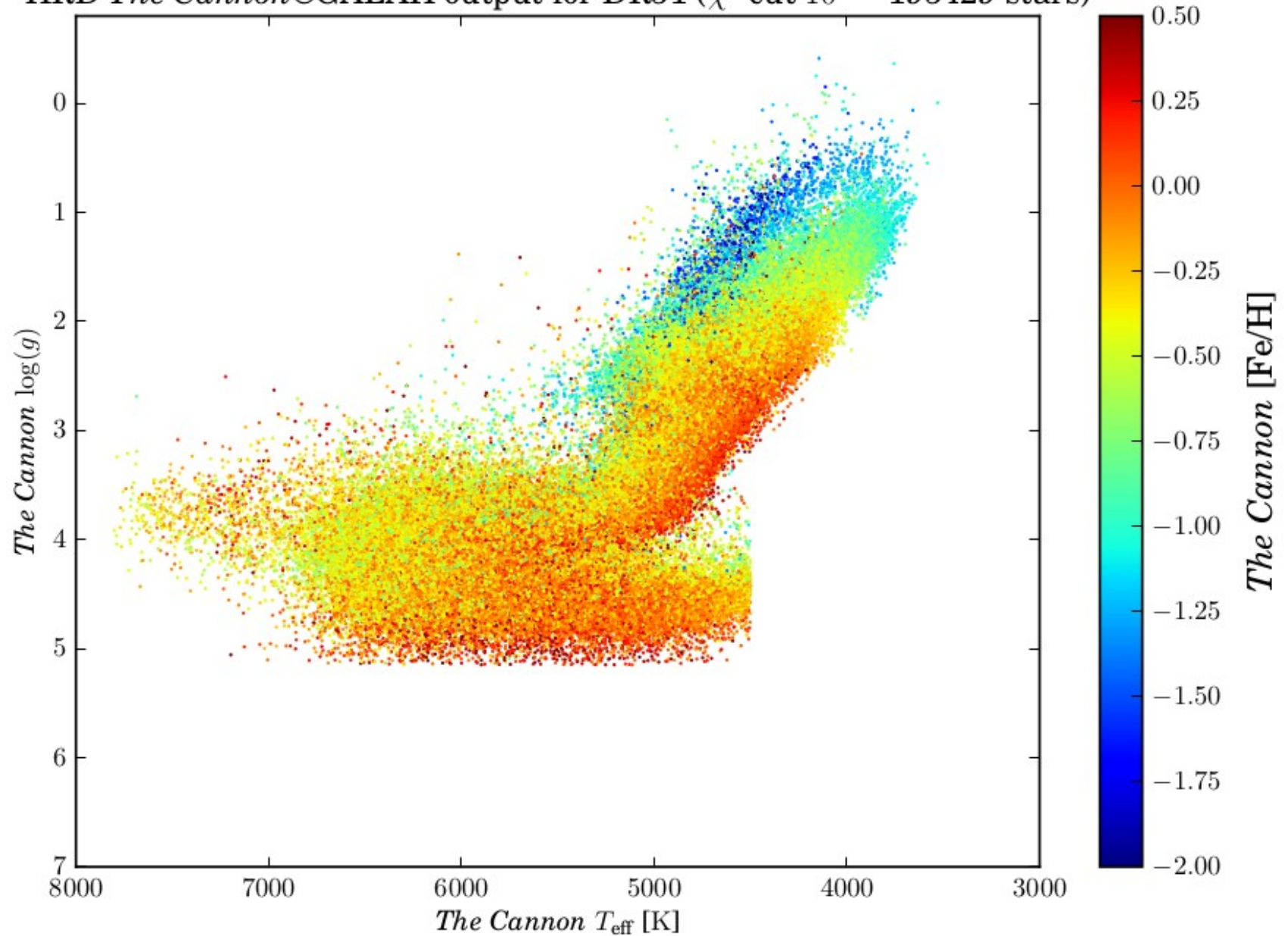
- Constant $\log g$ offset of 0.145dex was present for both the giant branch and MS dwarfs when compared to K2/isochrones.
- Manually corrected before the Cannon analysis.
- Potential telluric correction issues in data reduction.

Cannon self-test, T_{eff}



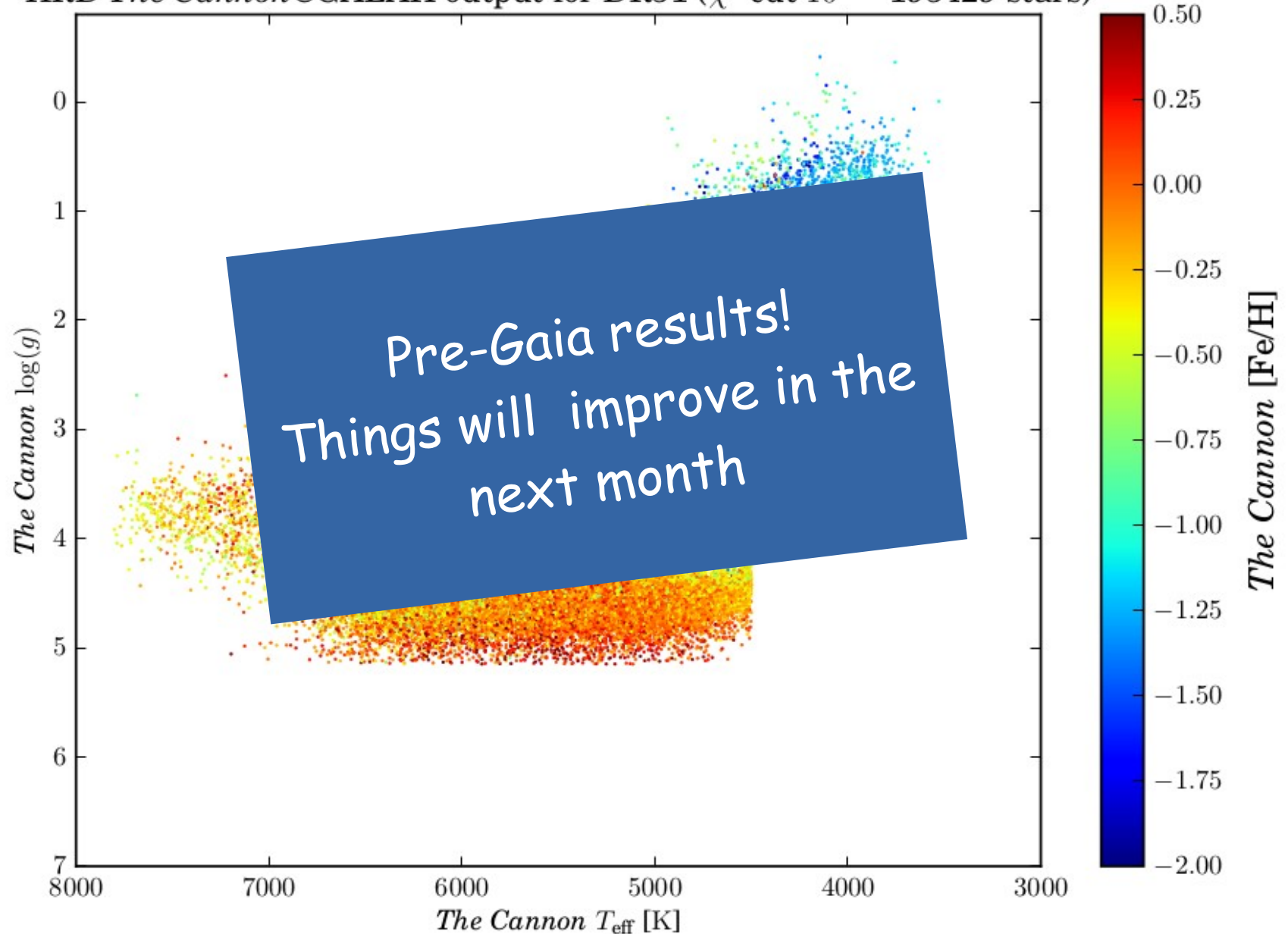
Cannon HR diagram, ~200k stars

HRD *The Cannon*@GALAH output for DR51 (χ^2 cut $10^{4.75}$ 195429 stars)



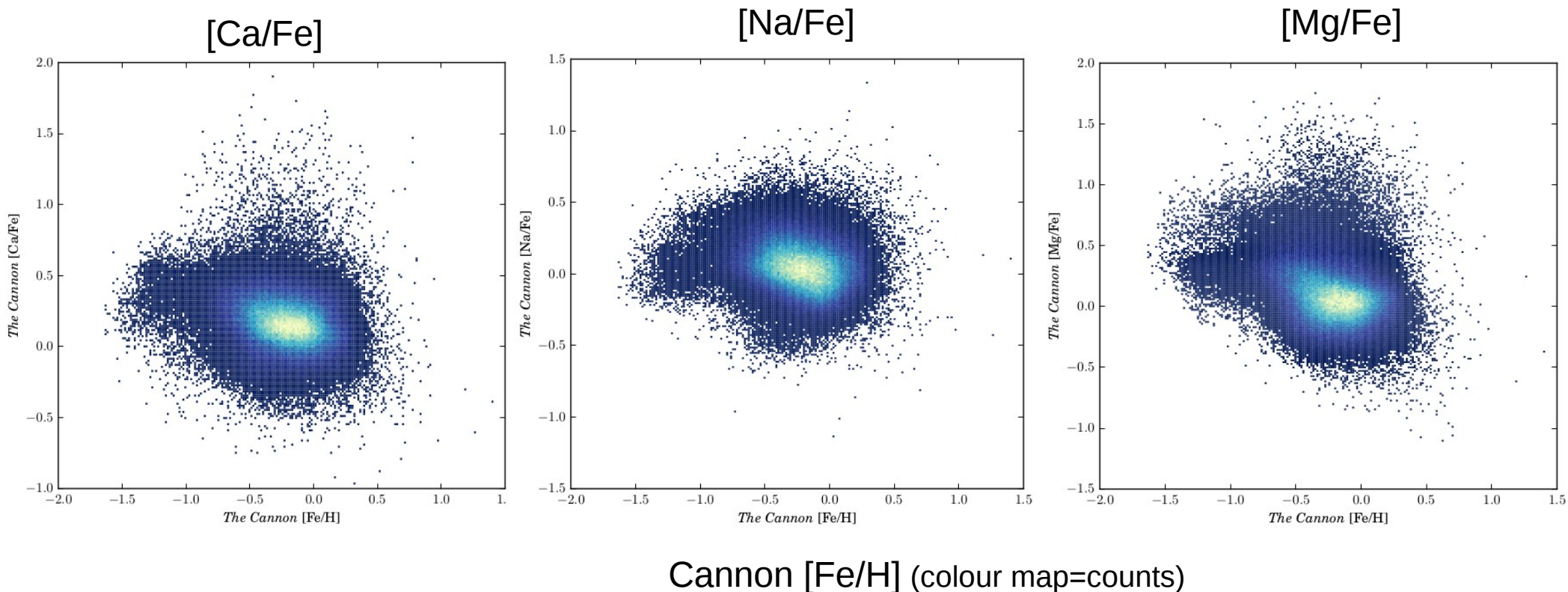
Cannon HR diagram, ~200k stars

HRD *The Cannon*@GALAH output for DR51 (χ^2 cut $10^{4.75}$ 195429 stars)



SME → Cannon training set (abundances)

- Training set of ~8500 stars with K2 logg and SNR>50/pixel.
- Abundances of 13 elements (Na, Mg, Al, Si, K, Ca, Sc, Ti, Cr, Fe, Ni, Cu, Ba), with additional Teff, logg, [Fe/H], E(B-V) labels.



Bayesian isochrone fitting

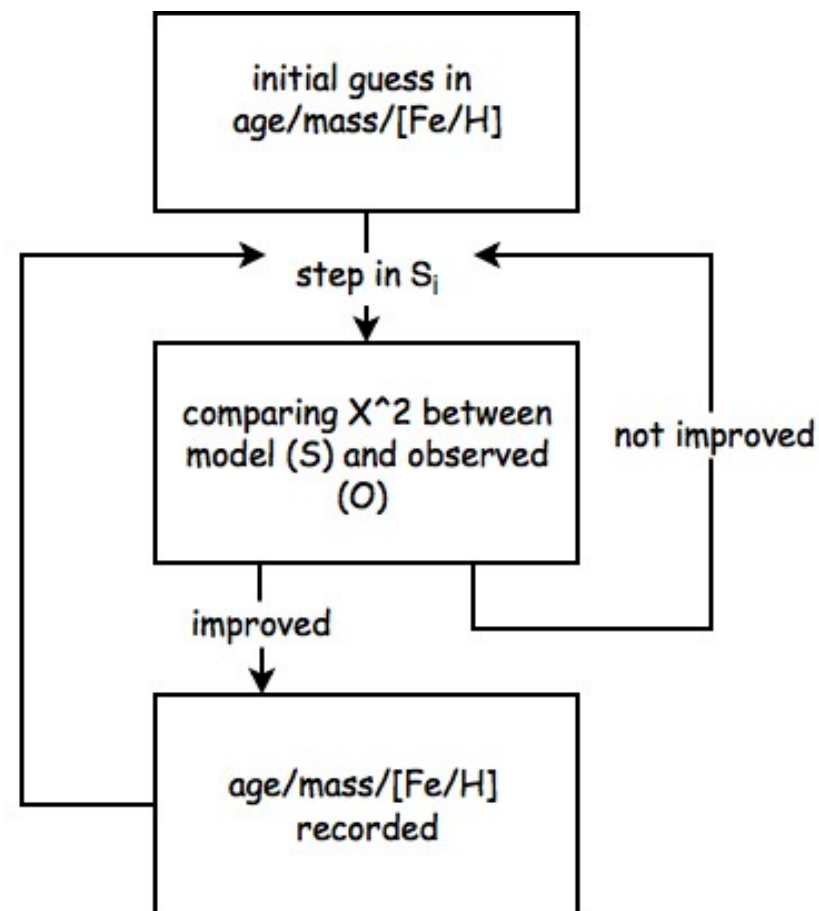
- The posterior probability p_1 can be written as:

$$p_1(M, \tau, [Fe/H] | O_i) = p_0 L / N$$

$$L = \frac{1}{\sqrt{(2\pi)^k |\Sigma_i|}} \exp\left(-\frac{1}{2}(O_i - S_i)^T \Sigma_i^{-1} (O_i - S_i)\right)$$

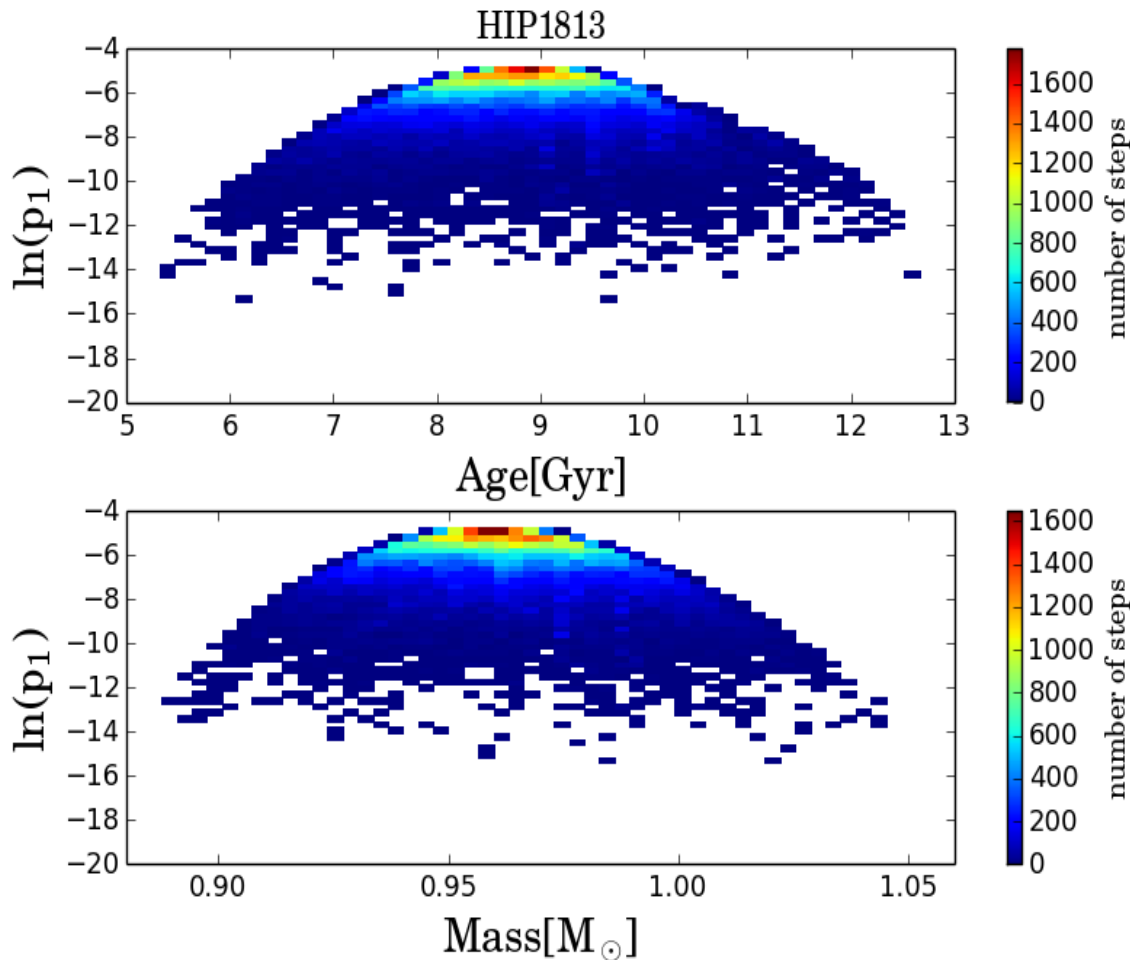
where M =mass, τ =age, O_i =observables, p_0 = prior, L =likelihood, N =normalisation constant, S_i =model parameters

- Flat prior in age (0-14Gyr), Salpeter IMF for mass.
- Posterior sampled using MCMC (Foreman-Mackey (2013)), with multiple walkers (100+)



Decision tree of a MCMC walker. The walker will only construct the chain when χ^2 has improved compared to the previous step.

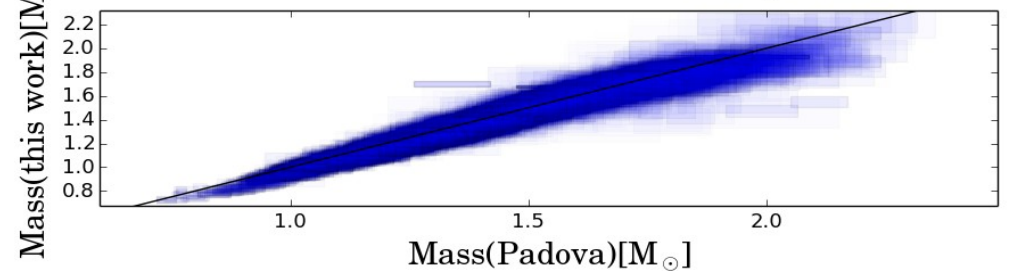
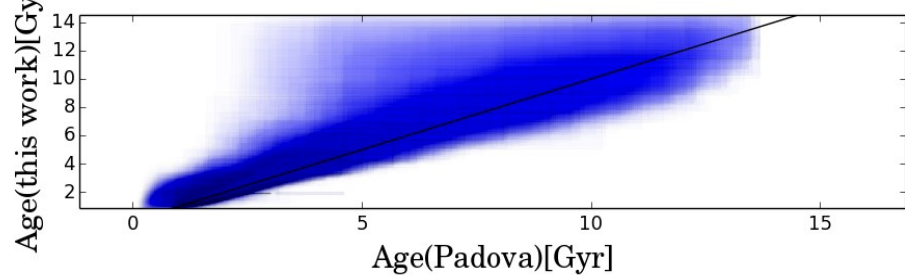
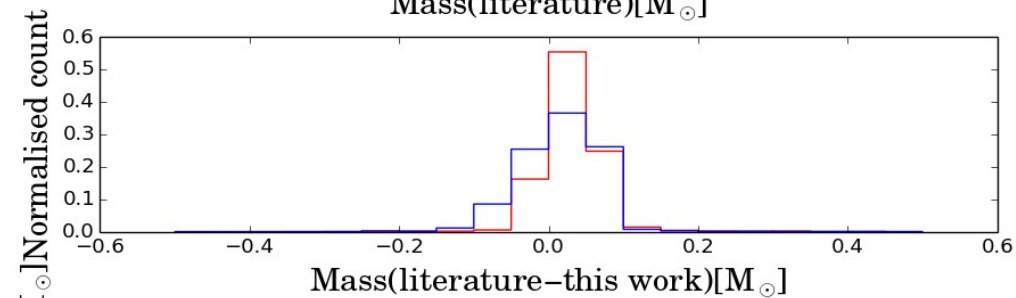
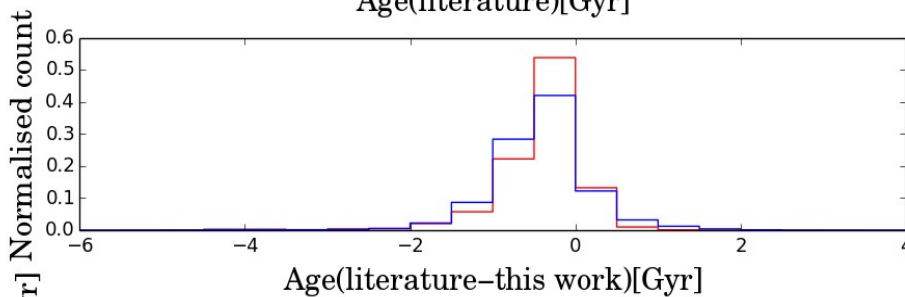
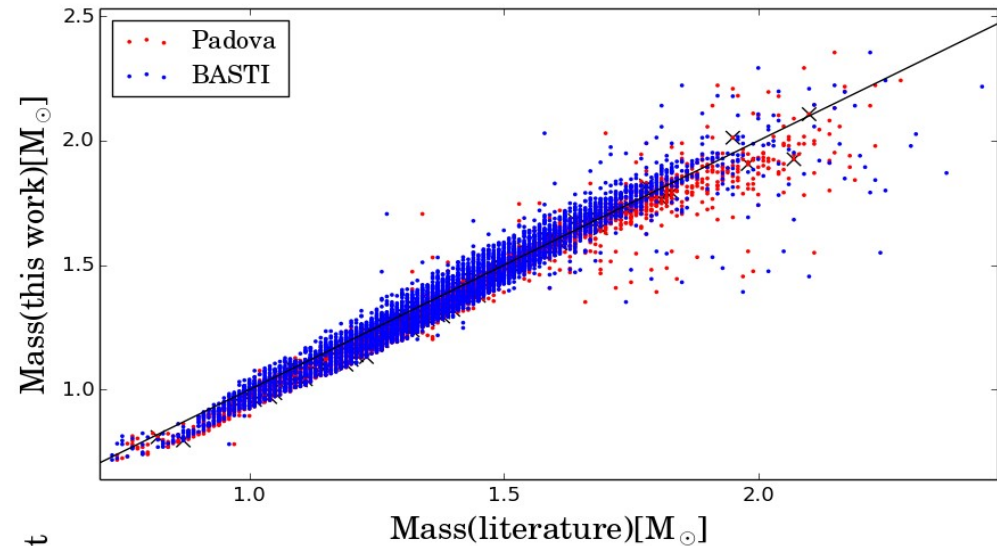
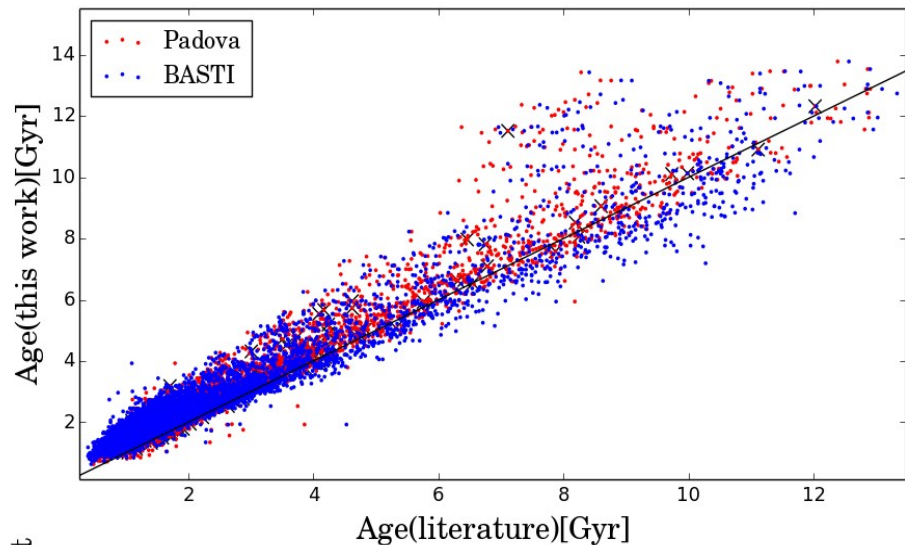
	Observable	Method
GALAH	T_{eff}	spectroscopy, photometry
	$\log g$	spectroscopy, asteroseismology
	$[\text{Fe}/\text{H}], [\alpha/\text{Fe}]$	spectroscopy
Parallax from Gaia	M_K	apparent magnitude and parallax
K2	ν_{max}	asteroseismology
	$\Delta\nu$	asteroseismology



- Isochrone sets from Dartmouth Stellar Evolution Database (Dotter 2008)
- Returns full distributions in mass, age and $[\text{Fe}/\text{H}]$, and all model parameters (T_{eff} , $\log g$, $[\text{Fe}/\text{H}]$, M_K)

Comparison with GCS (Casagrande (2011))

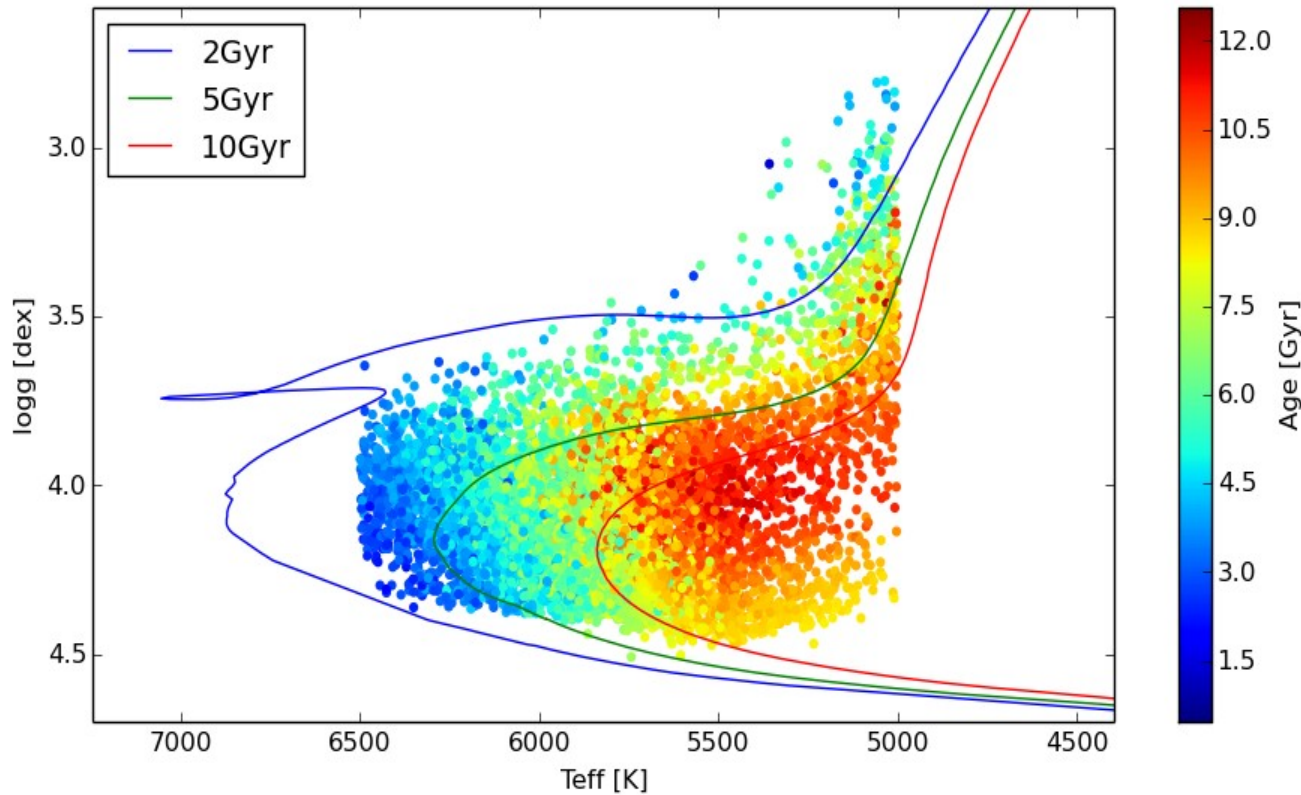
This work



Age (GCS)
(mean difference 0.45Gyr)

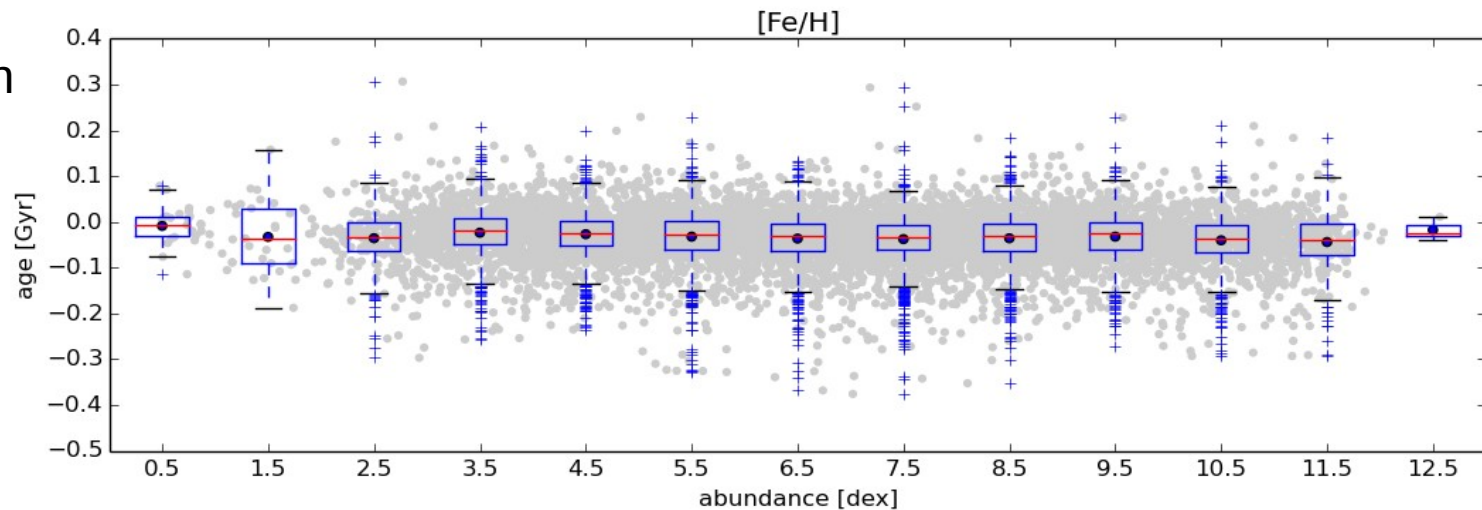
Mass (GCS)

GALAH HR diagram & age-metallicity



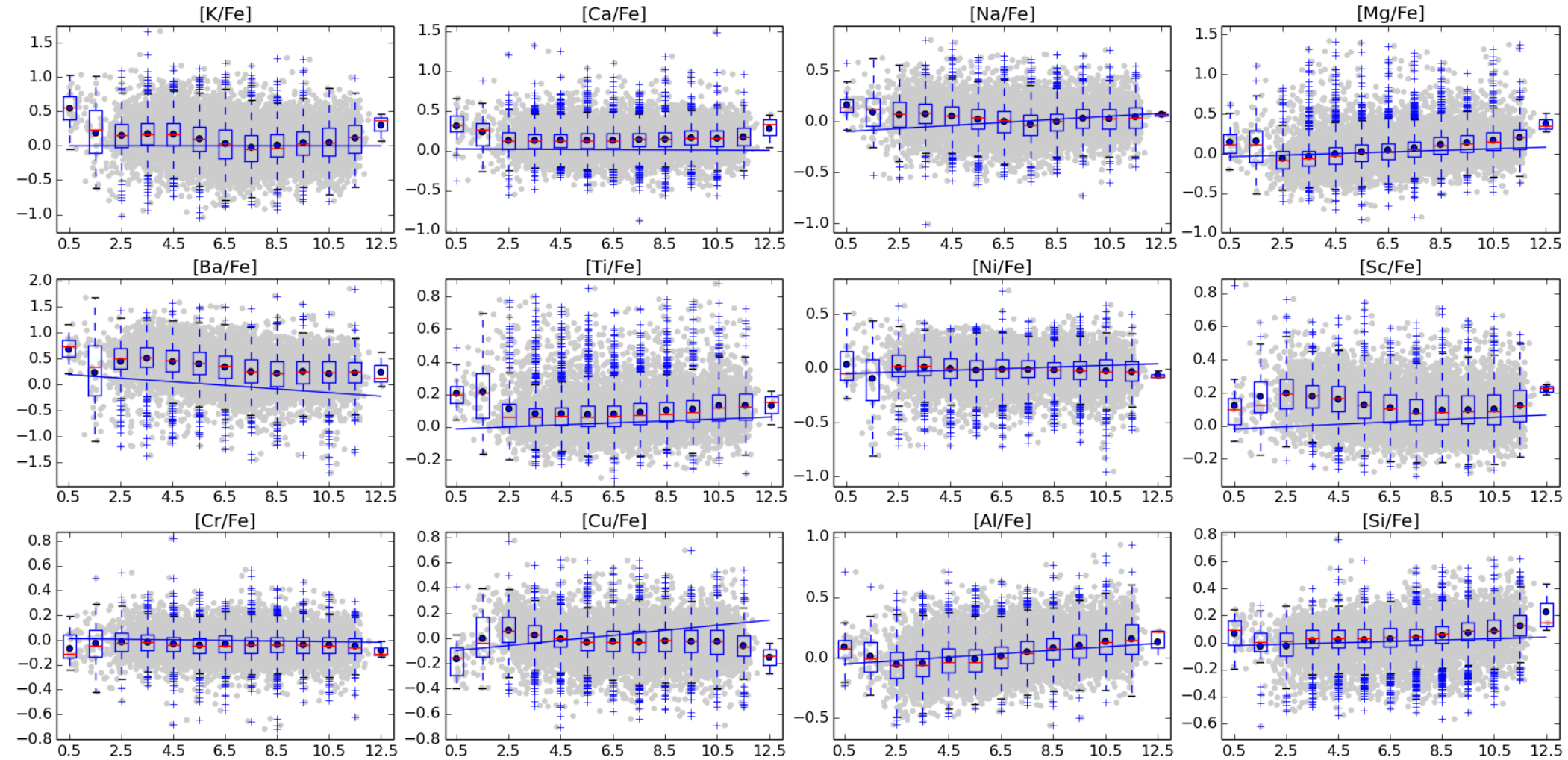
HR diagram of ~9000 Cannon stars colour coded in age. Only stars with bad MCMC chains are cut from the sample.

Age-metallicity relation for the sample. Flat in the solar neighbourhood



[X/Fe] v Age

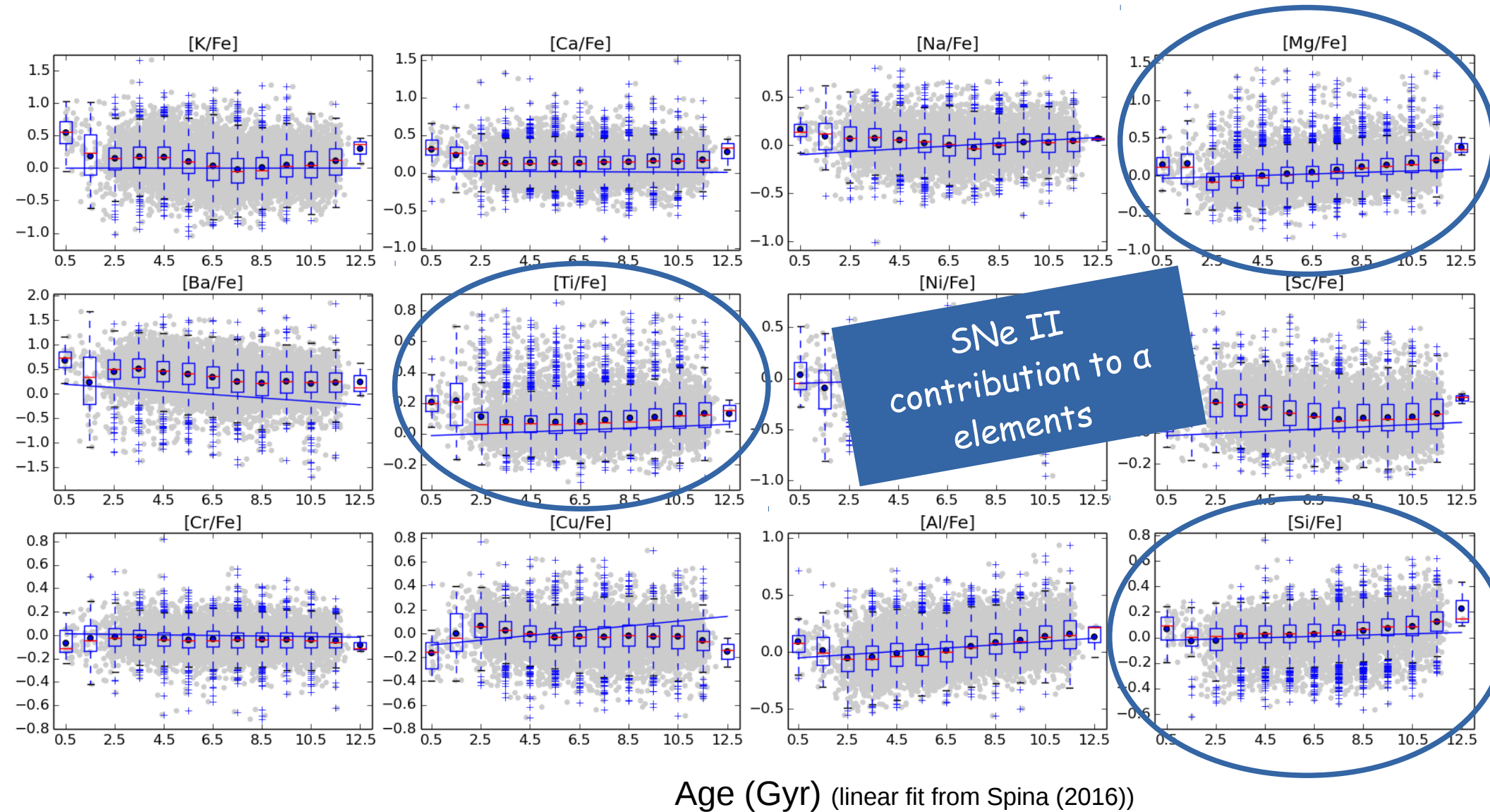
(complementing high precision studies of solar twins)



Age (Gyr) (linear fit from Spina (2016))

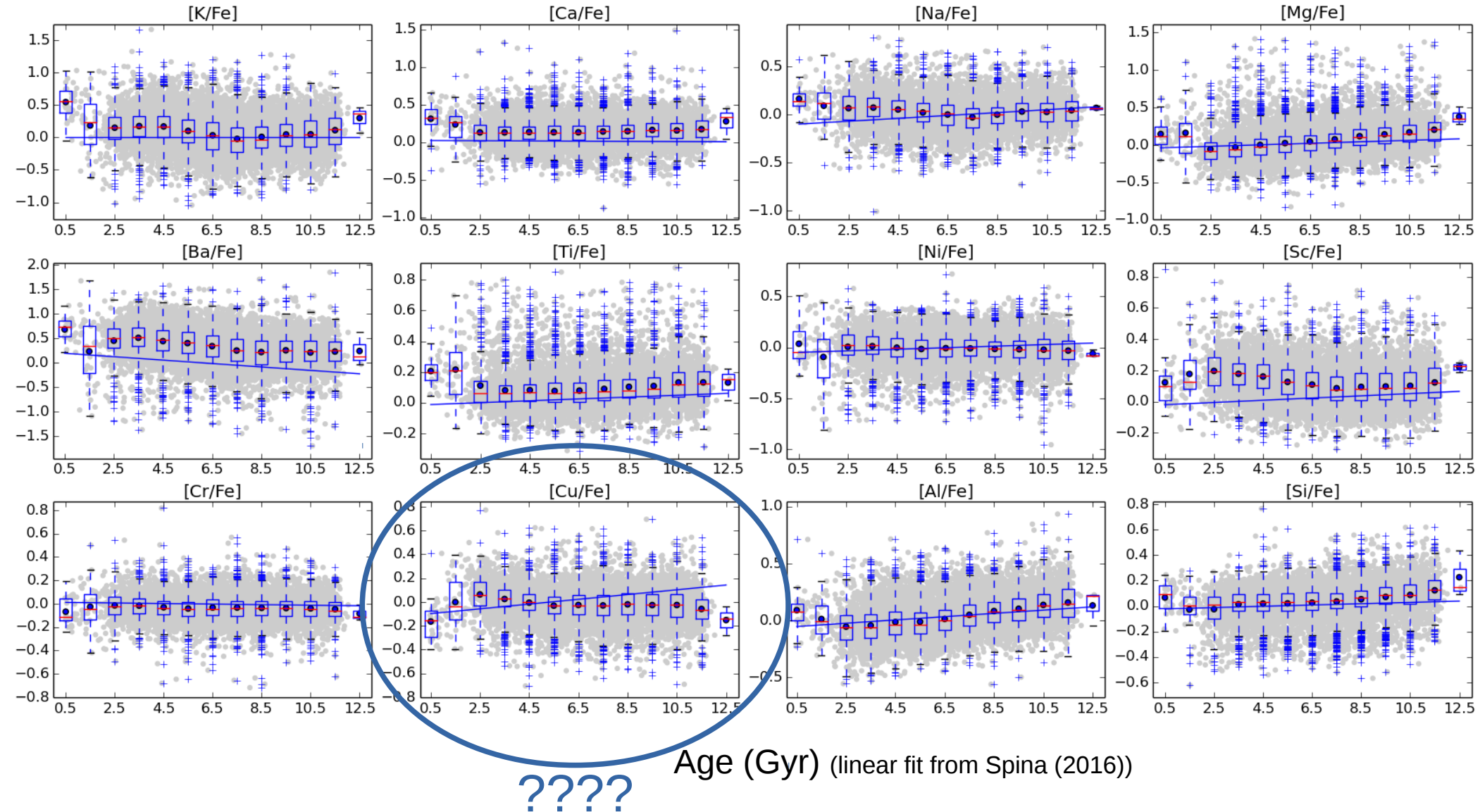
[X/Fe] v Age

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Fresh off the
press TGAS
results!!!

Pre-TGAS



TGAS

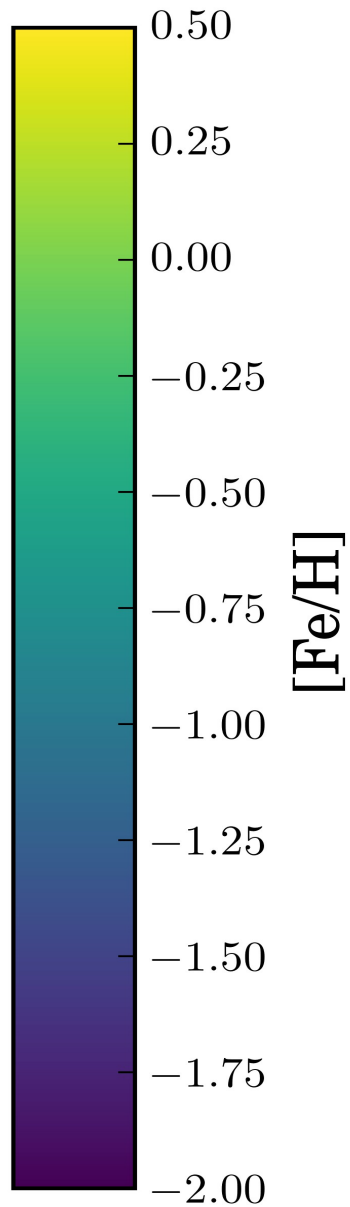
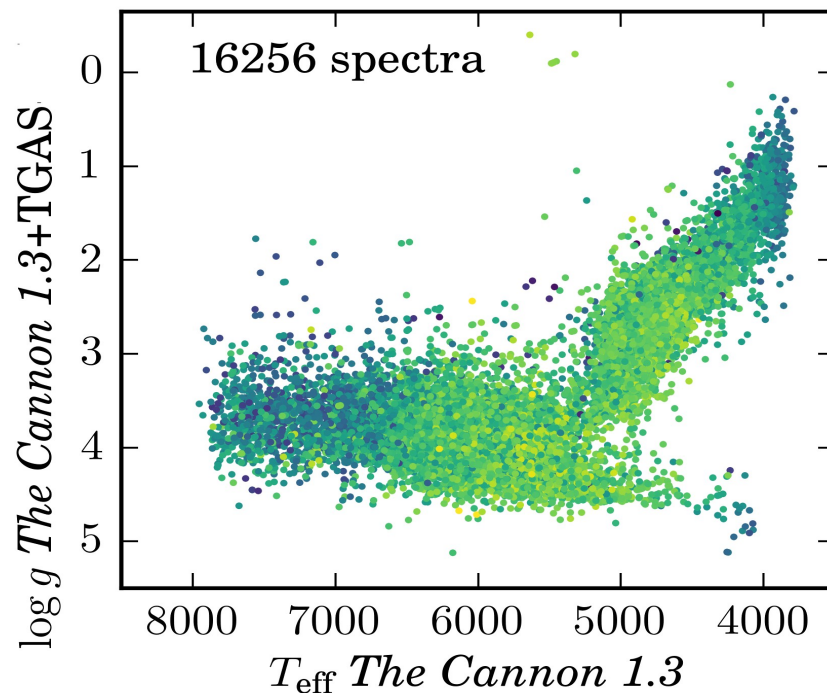
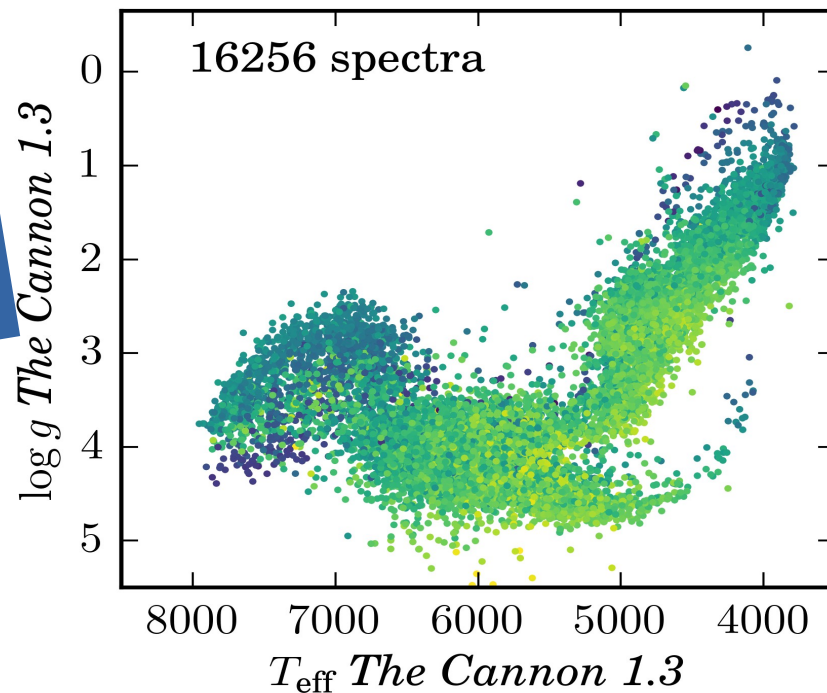


Figure from Sven Buder

Fresh off the
press TGAS
results

TL:DR
Exciting times
ahead with Gaia!

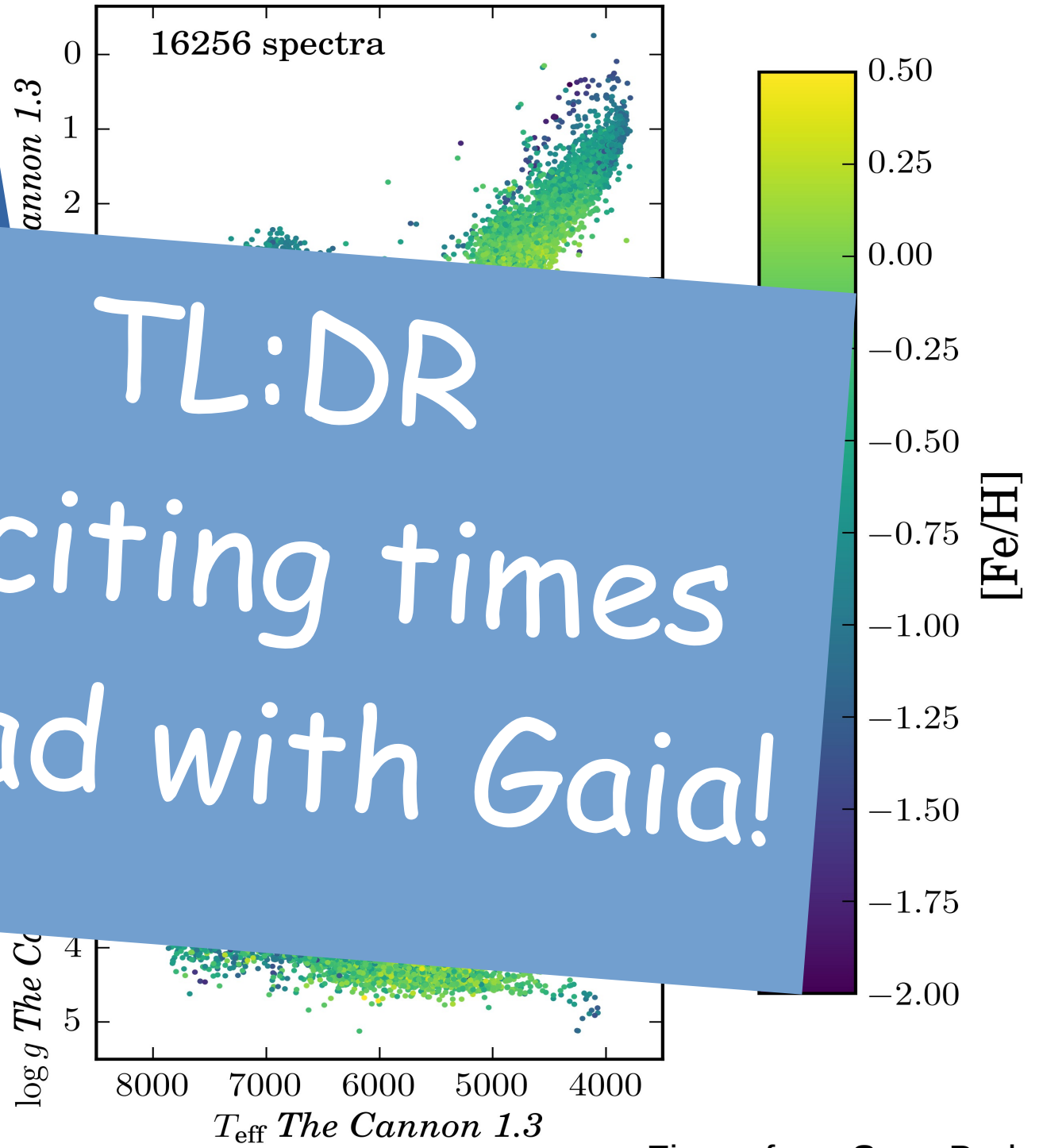


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