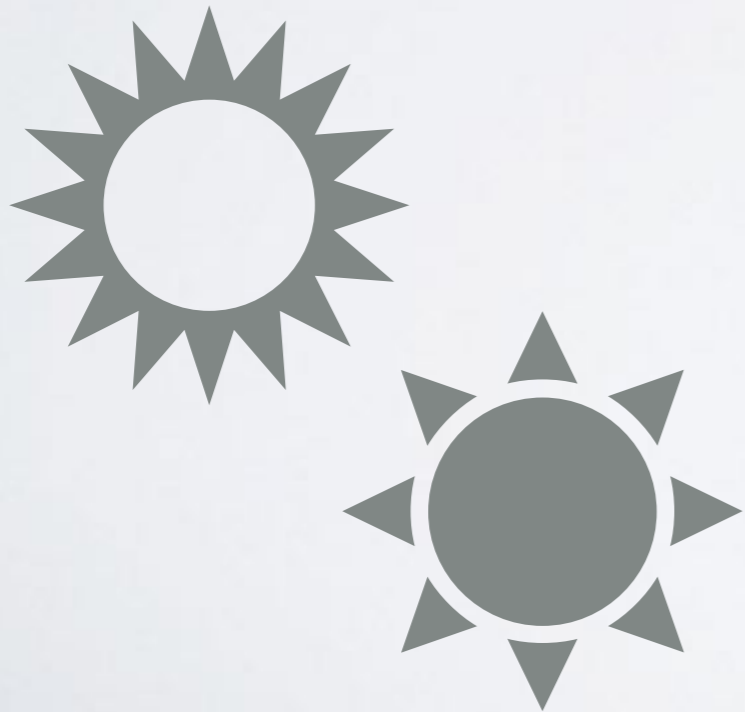


# DETERMINING STELLAR PARAMETERS FROM SPECTROSCOPIC OBSERVATIONS

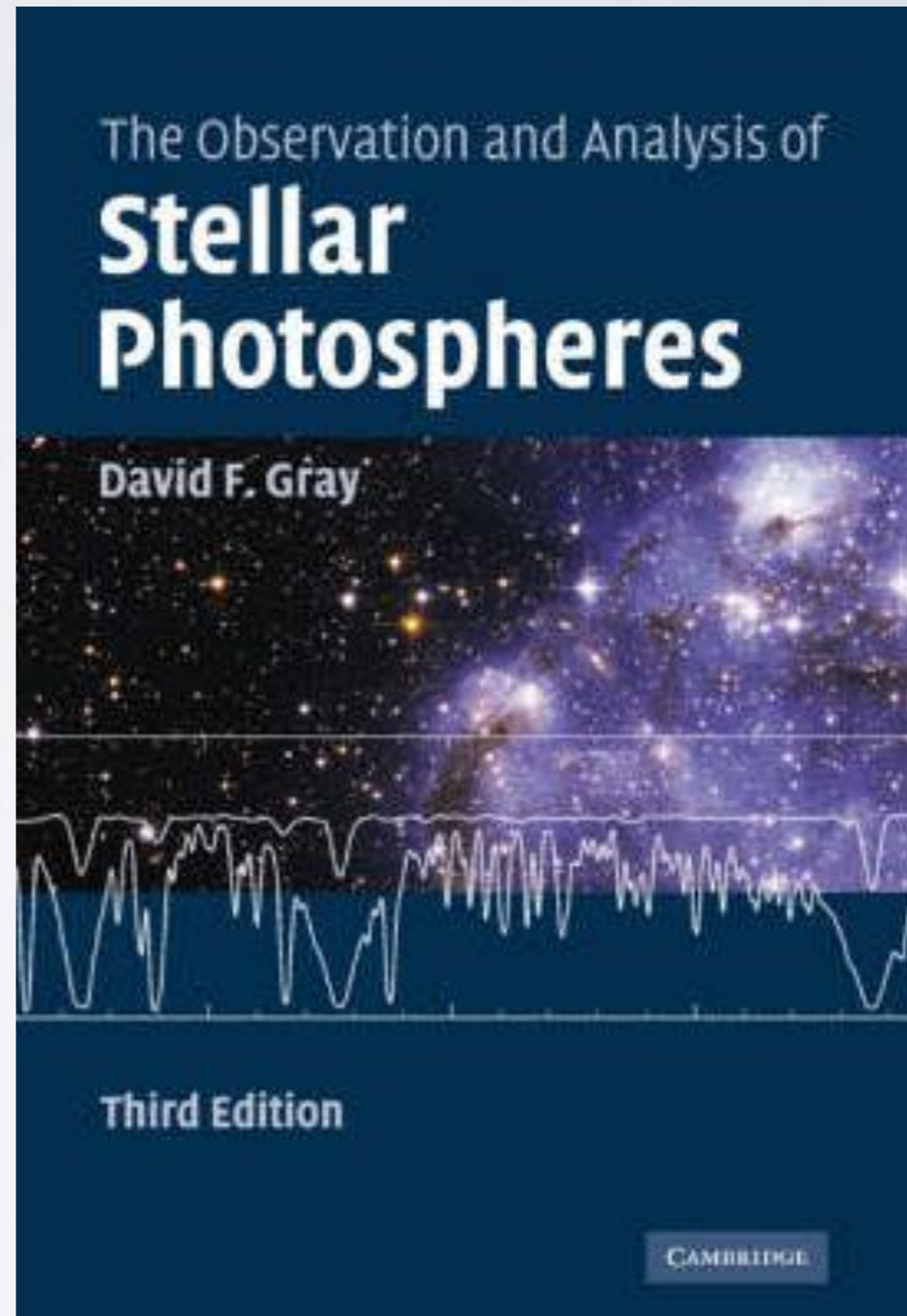
**Philip Muirhead**

Department of Astronomy  
Boston University

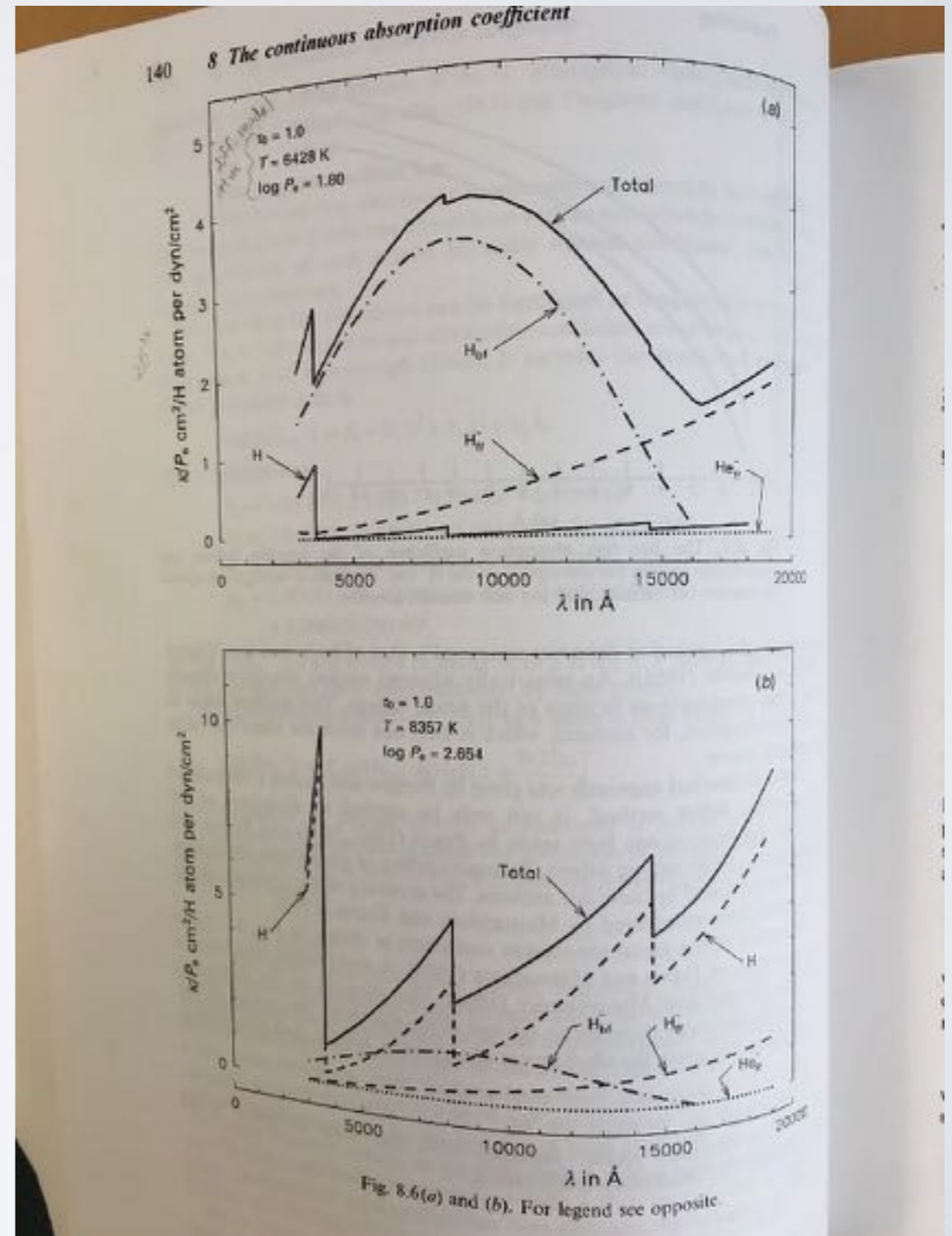
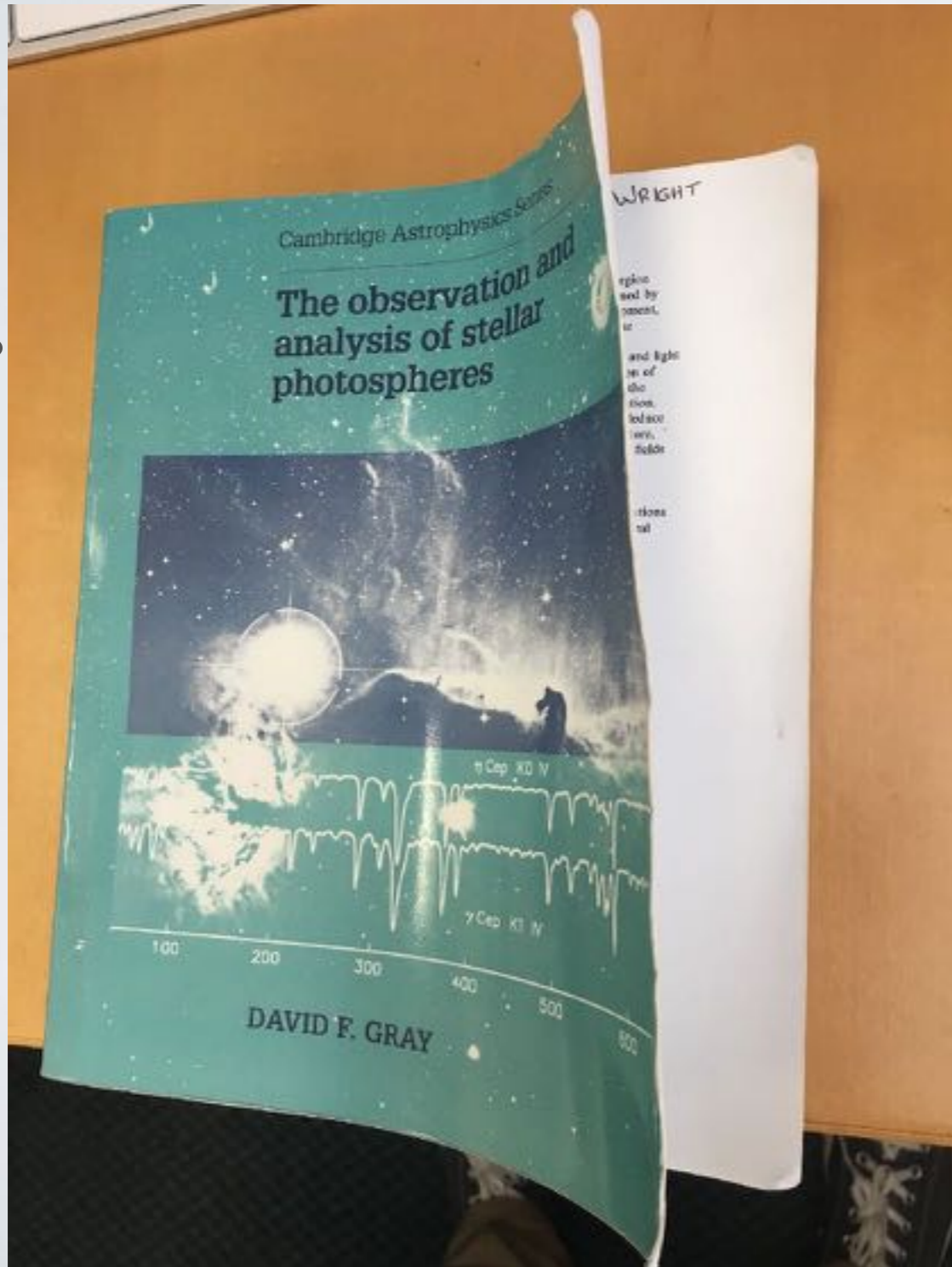


# FOR THE FUNDAMENTALS

- My personal recommendation for the fundamentals of acquiring and interpreting stellar spectra.
- Includes the basics of **stellar atmosphere models**.

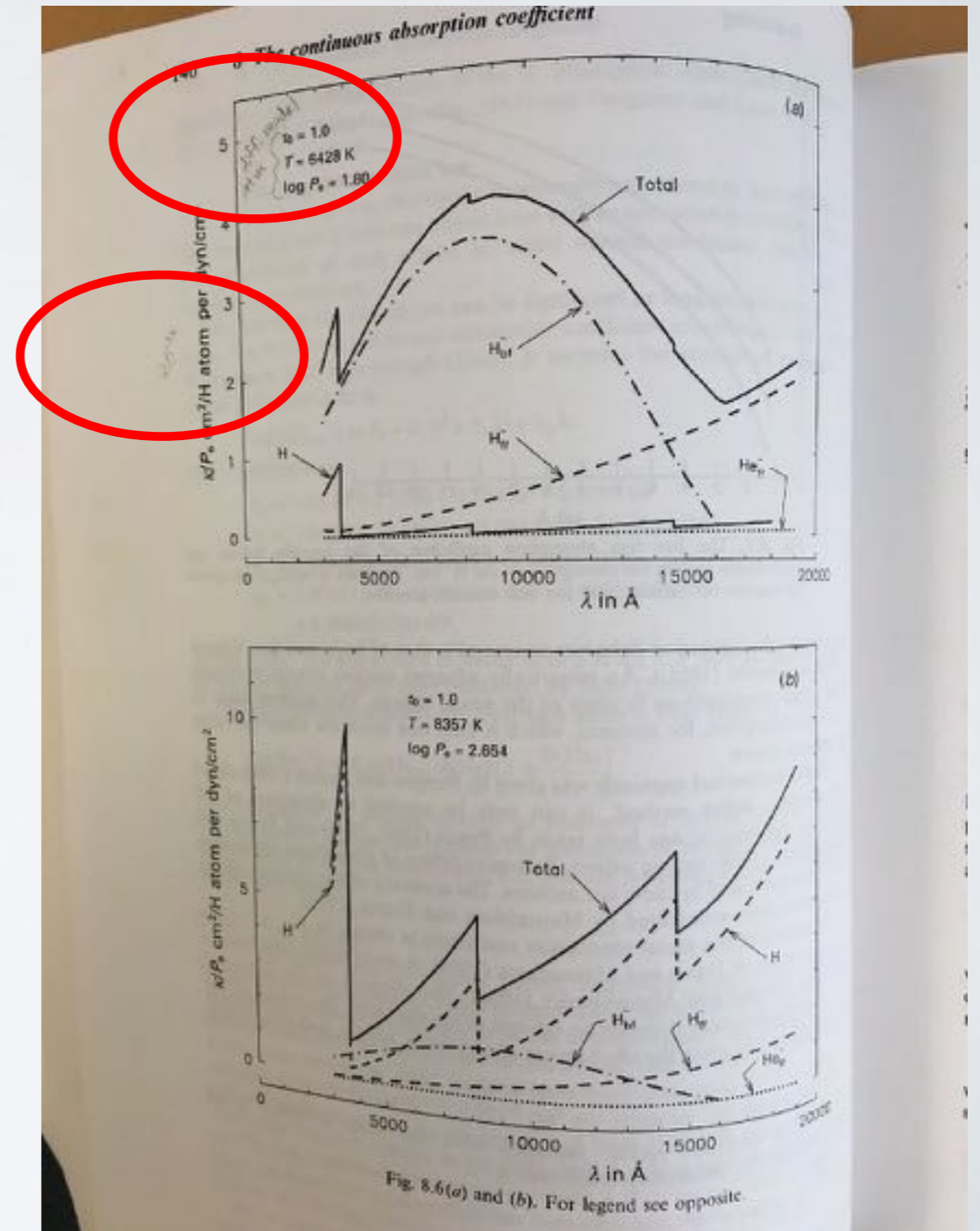
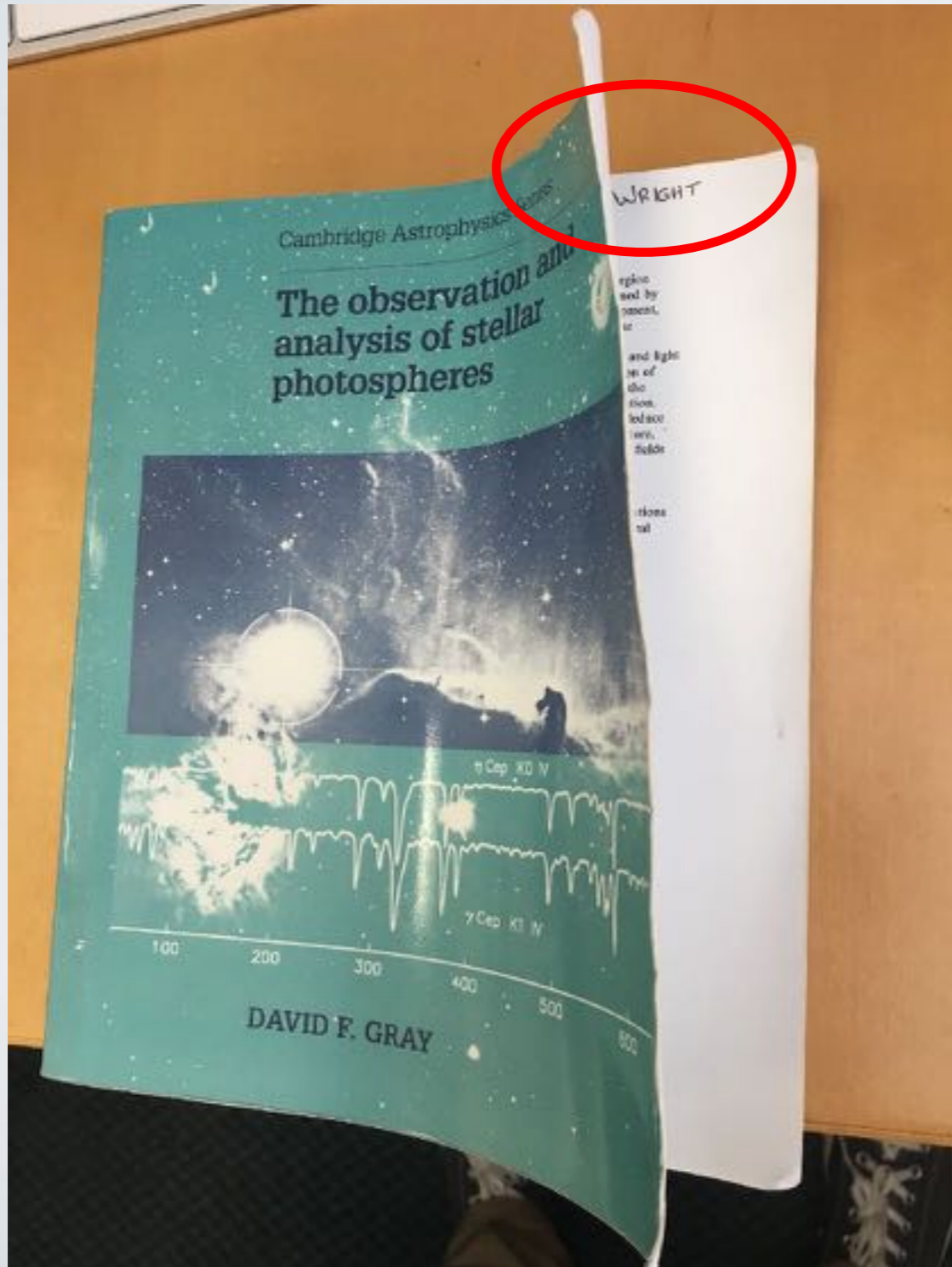


# I OWN JASON WRIGHT'S COPY





# I OWN JASON WRIGHT'S COPY



# KEITH IS RIGHT, IT IS A DARK ART

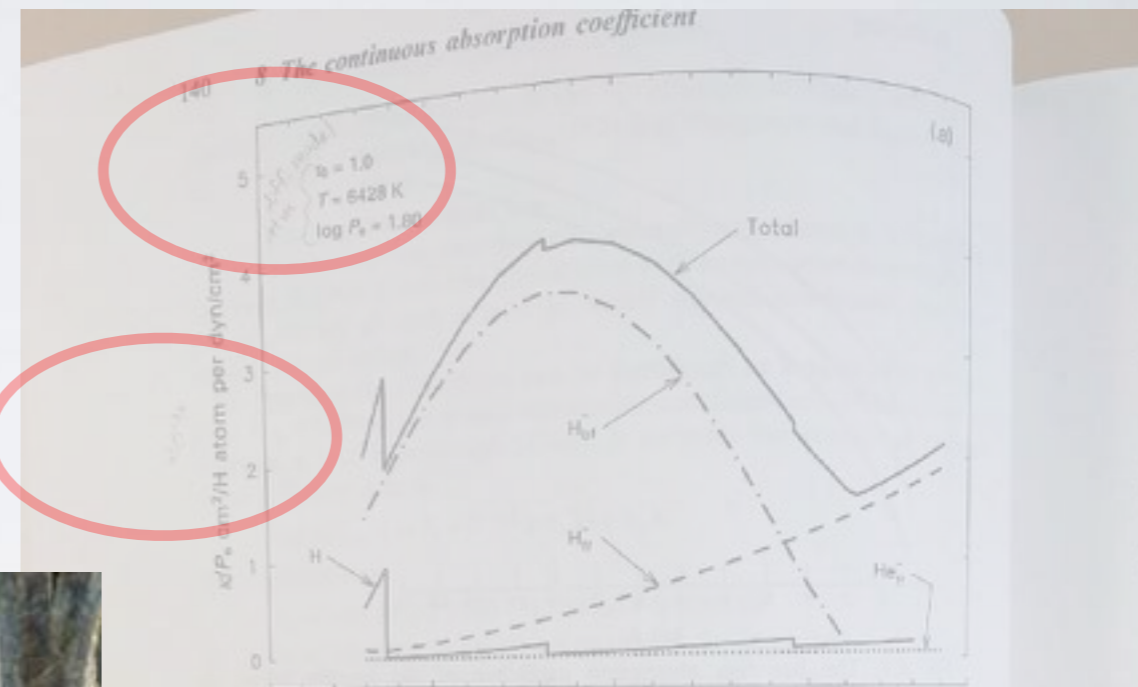
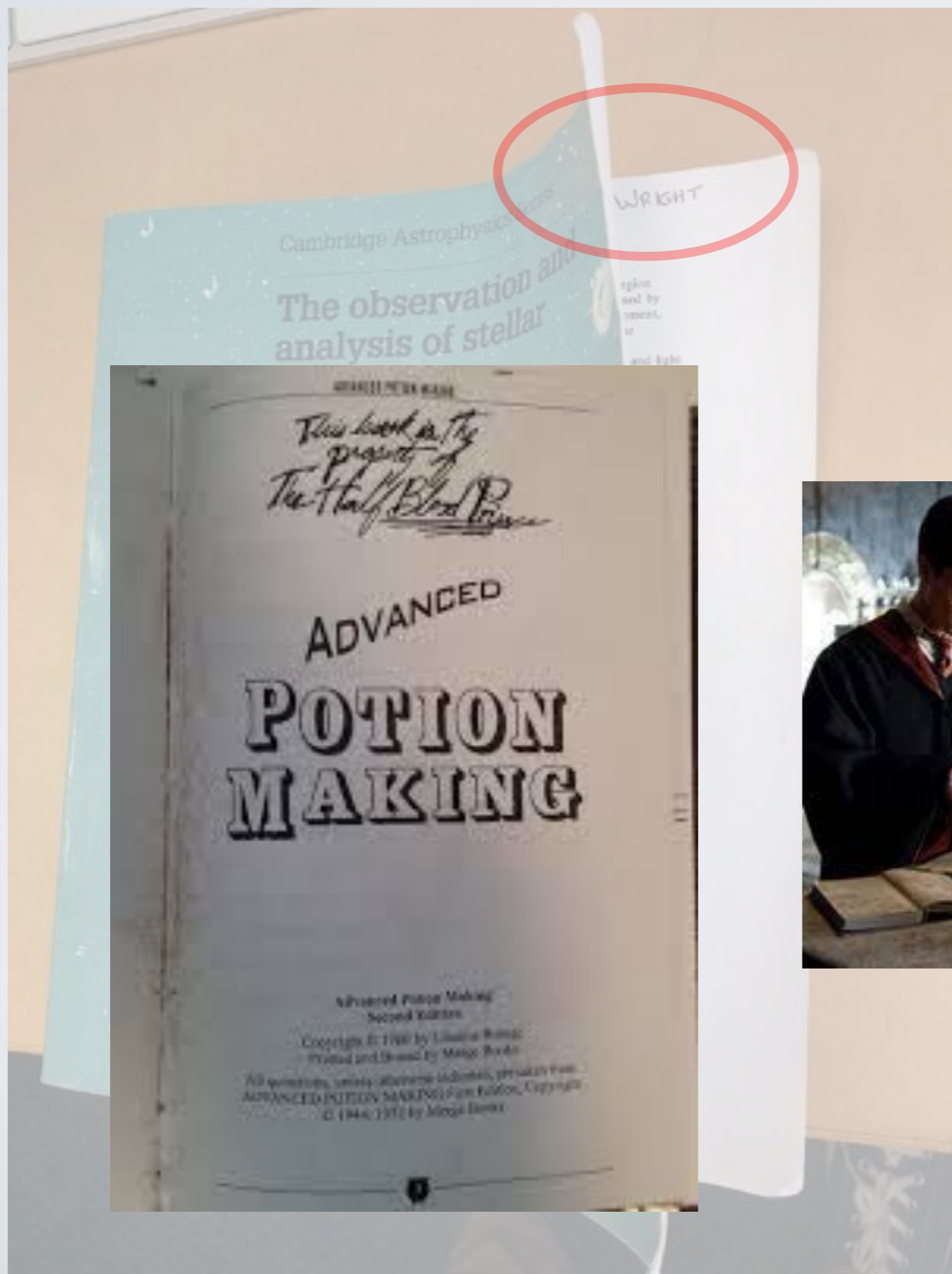


Fig. 8.6(a) and (b). For legend see opposite.



# ATTEND THIS SUMMER SCHOOL

- Annual early-career workshop on Modules for Experiments in Stellar Astrophysics (MESA).
- Great for understanding the fundamentals of **stellar evolutionary models.**

2017 MESA Summer School : August 14 - 18

[Home](#) [Application](#) [Agenda](#) [Lodging](#) [Participants](#) [Directors](#) [Feedback](#)



The 6th Annual [MESA](#) Summer School will be held August 14-18, 2017 at UC Santa Barbara. Though extensive hands-on labs, participants will gain familiarity with MESA and learn how to make better use of MESA in their own research. Featured MESA topics include planets, binaries and much more with Leslie Rogers, Jonathan Fortney, Selma De Mink, and Pablo Marchant. See the [Agenda](#) for additional information. Enrollment is limited and the [Application](#) period closes March 1, 2017.

[MESA](#) has attracted over 900 registered users and provides a [portal](#) for the stellar community to openly share knowledge. The instrument papers [MESA I](#), [MESA II](#), and [MESA III](#) describe MESA. Summer Schools were previously offered in [2016](#), [2015](#), [2014](#), [2013](#), and [2012](#).

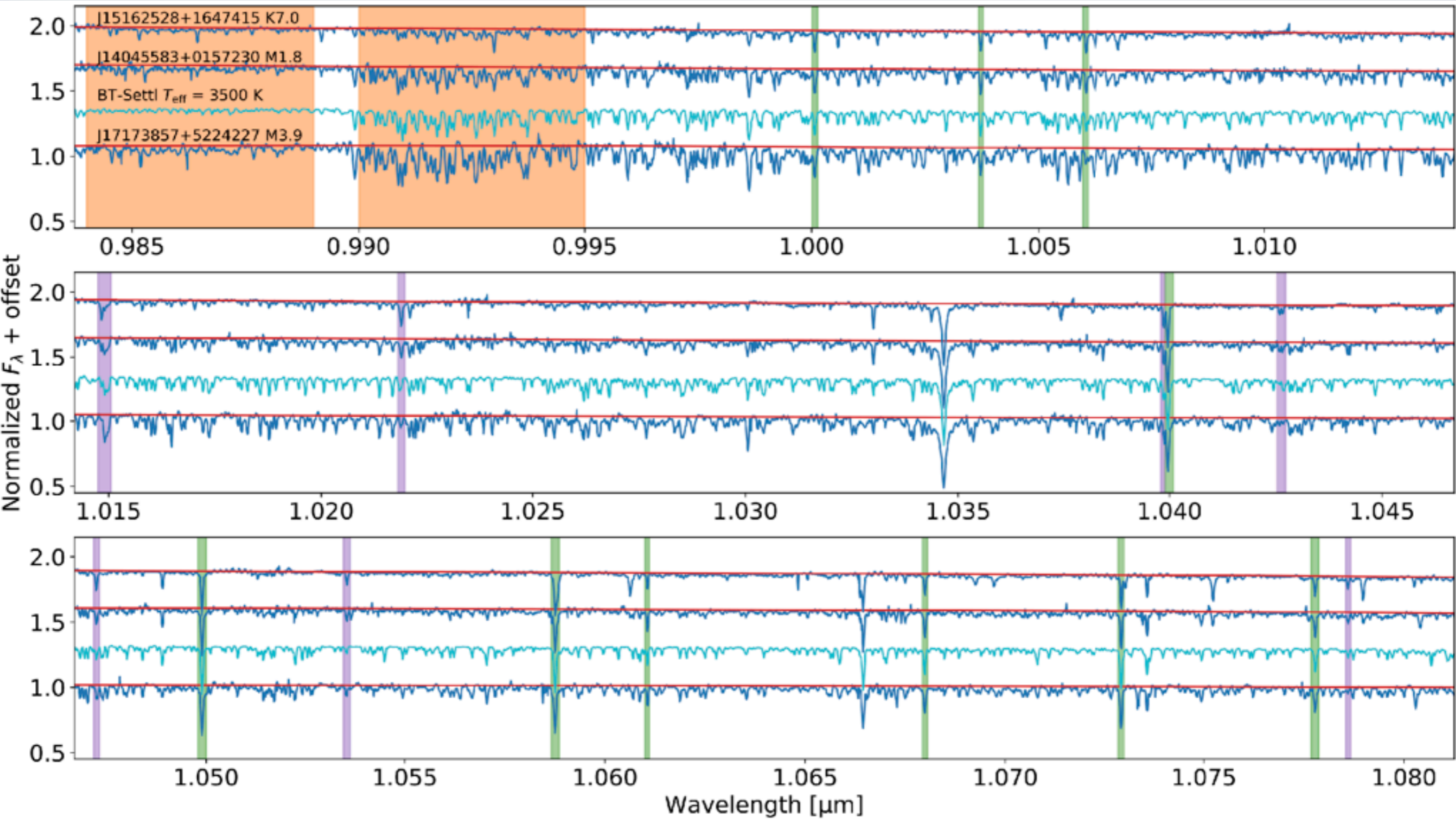
MESA

UCSB  
UNIVERSITY OF CALIFORNIA  
SANTA BARBARA

ASU



# M Dwarfs in Y Band (Keck-NIRSPEC)



Spectra contain an **enormous** amount of information (not just RV!)

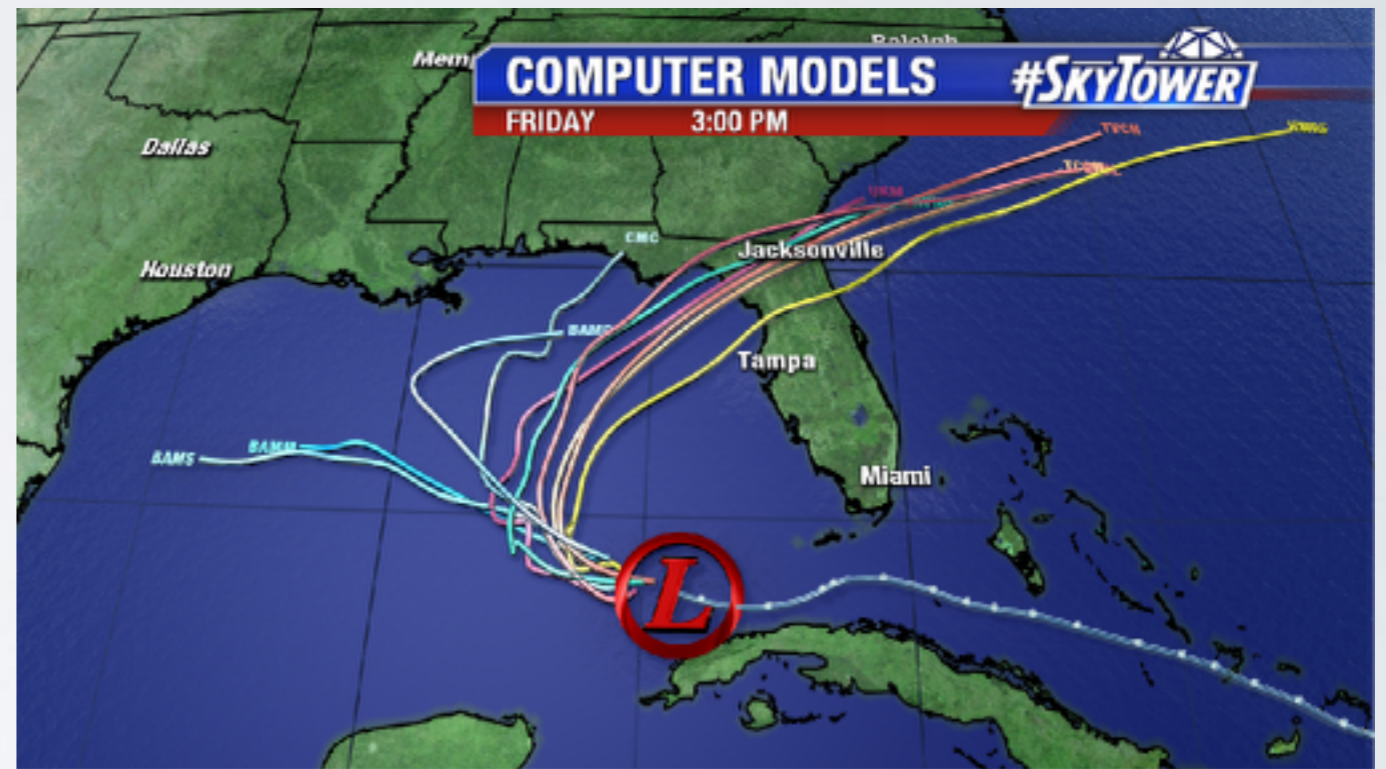
# REDUCE TO A HANDFUL OF PARAMETERS

- Spectral Type
- Effective temperature
- Surface gravity
- Abundances



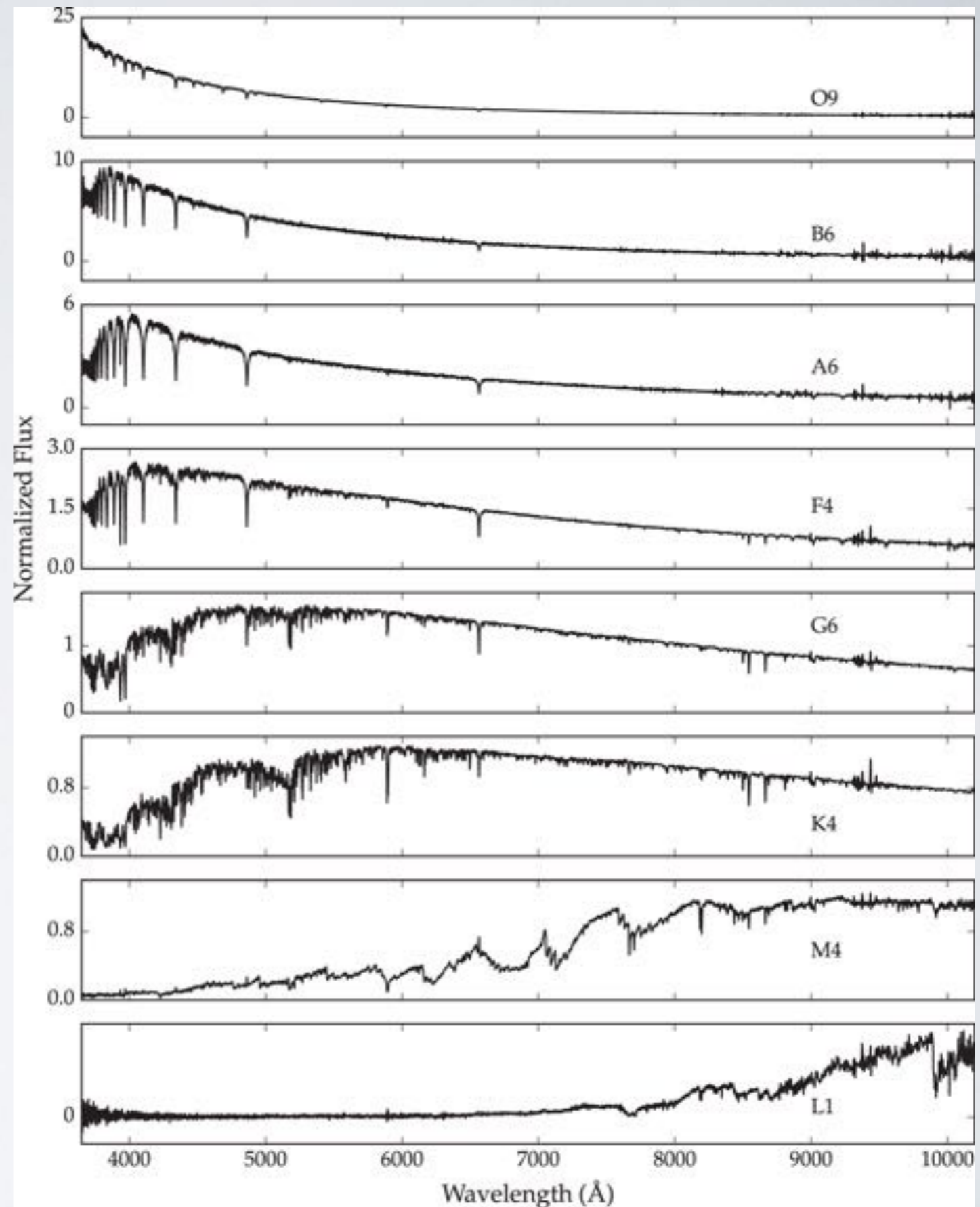
# REDUCE TO A HANDFUL OF PARAMETERS

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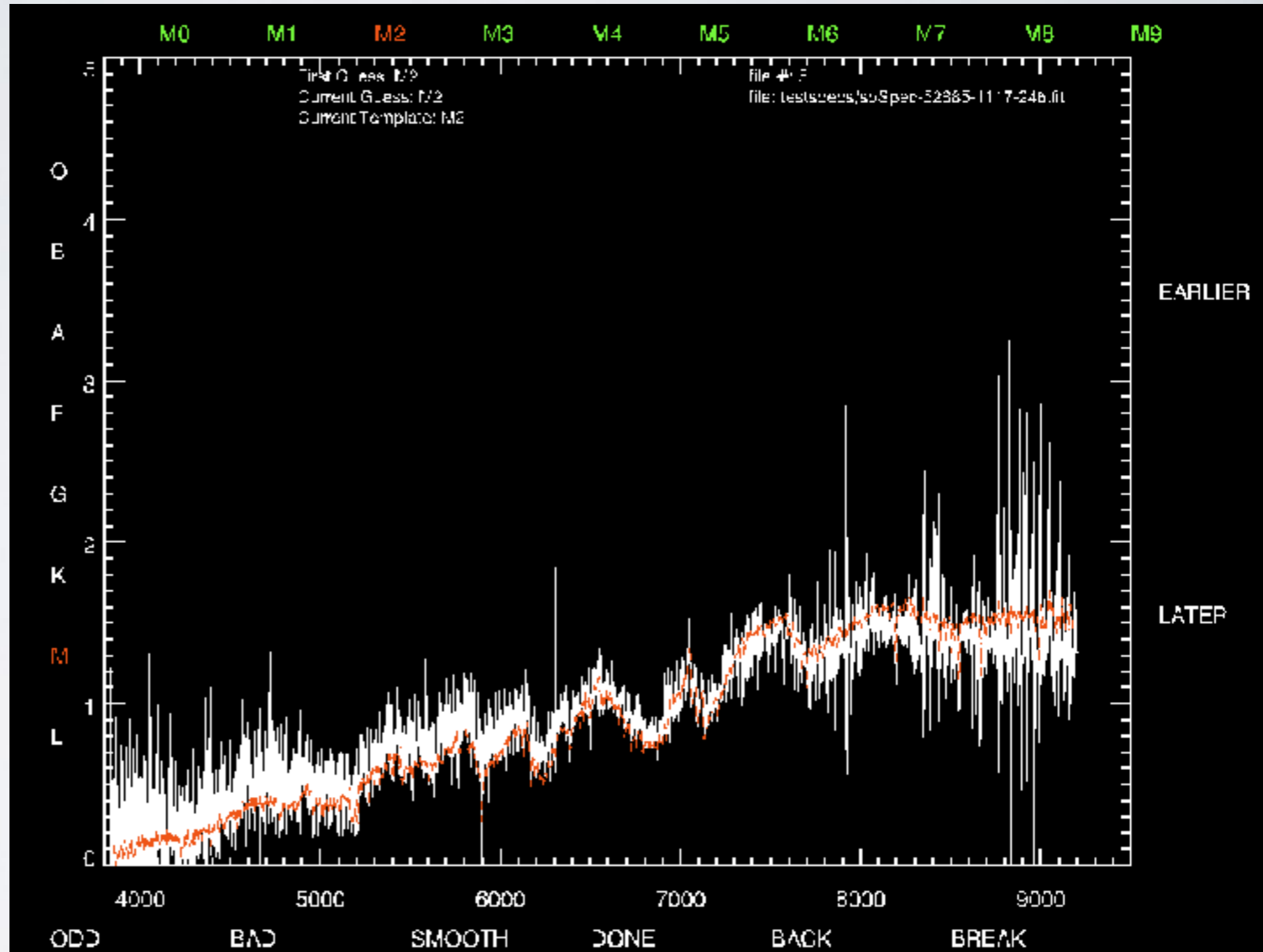
**Lots of data -> few desired  
parameters  
(e.g. hurricane landfall)  
Bound to have disagreements**

- **Spectral Type**
- Effective temperature
- Surface gravity
- Abundances



# SPECTRAL TYPE

- A “by eye” process ever since Annie Jump Cannon.

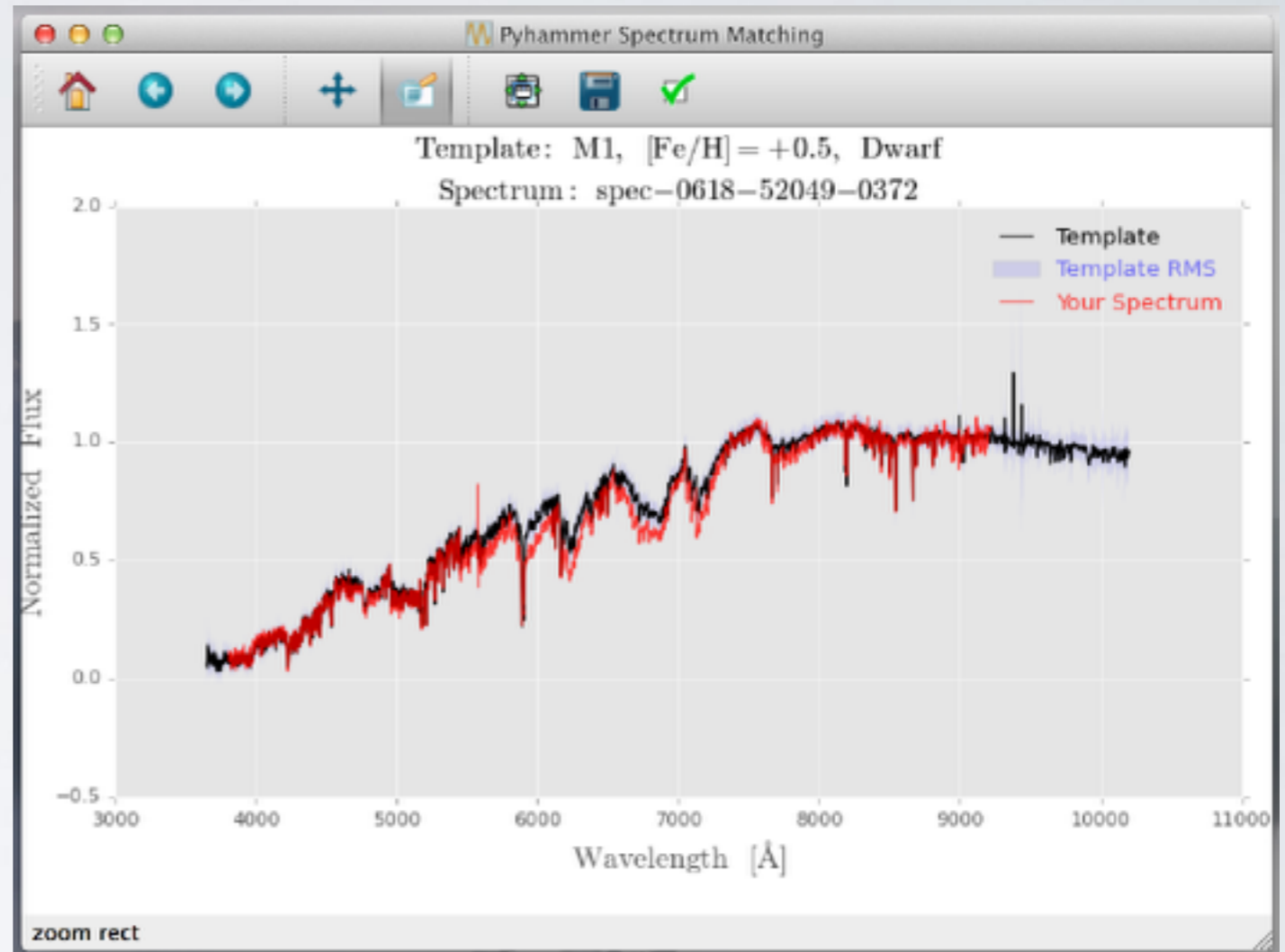


**The Hammer (Covey et al. 2007)**



# SPECTRAL TYPE

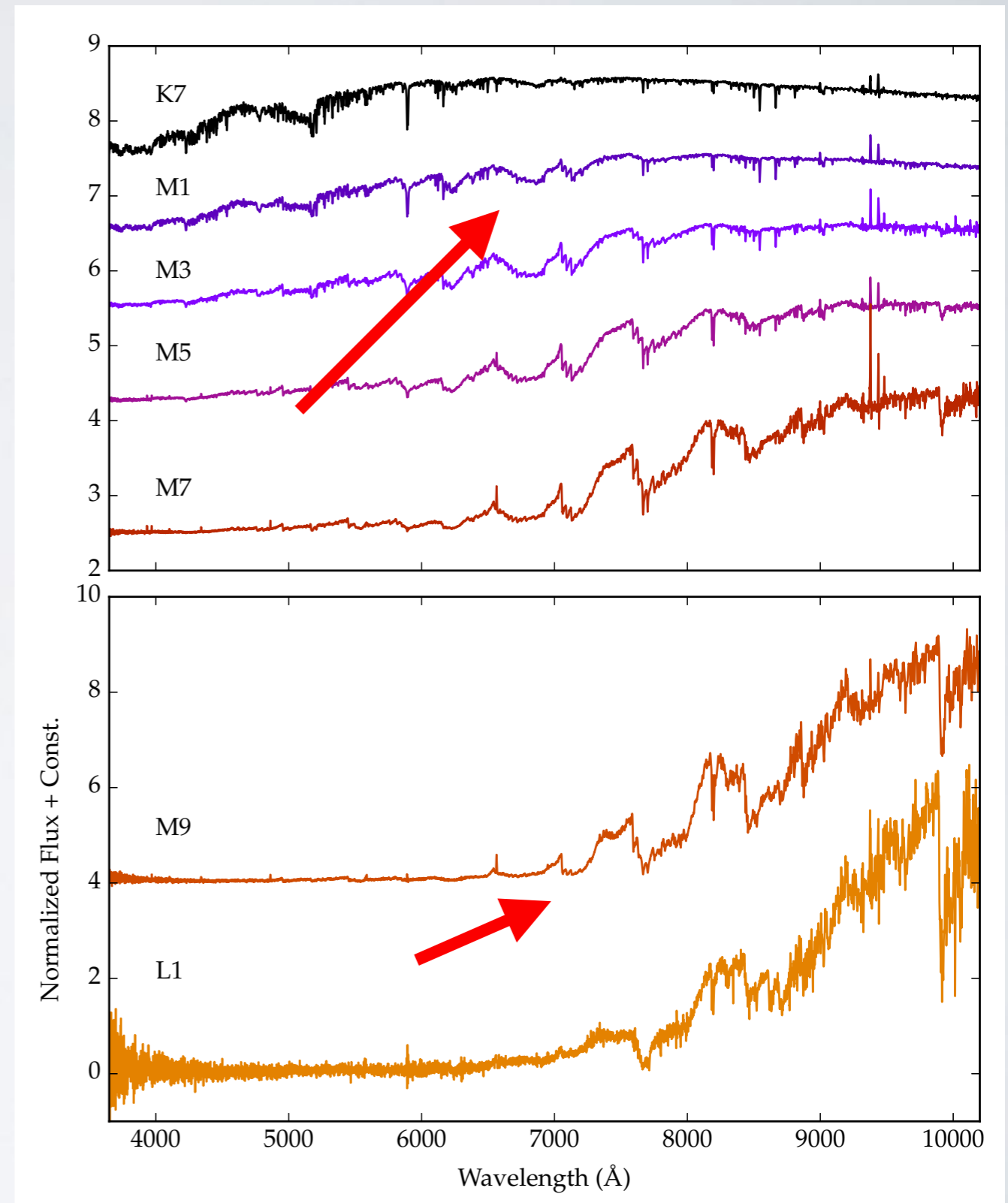
- Recently, new software developed to auto-spectral type large data sets.
- PYHAMMER
  - Kesseli et al. 2017



<https://github.com/BU-hammerTeam/PyHammer>

# SPECTRAL TYPE: LIMITS OF USE

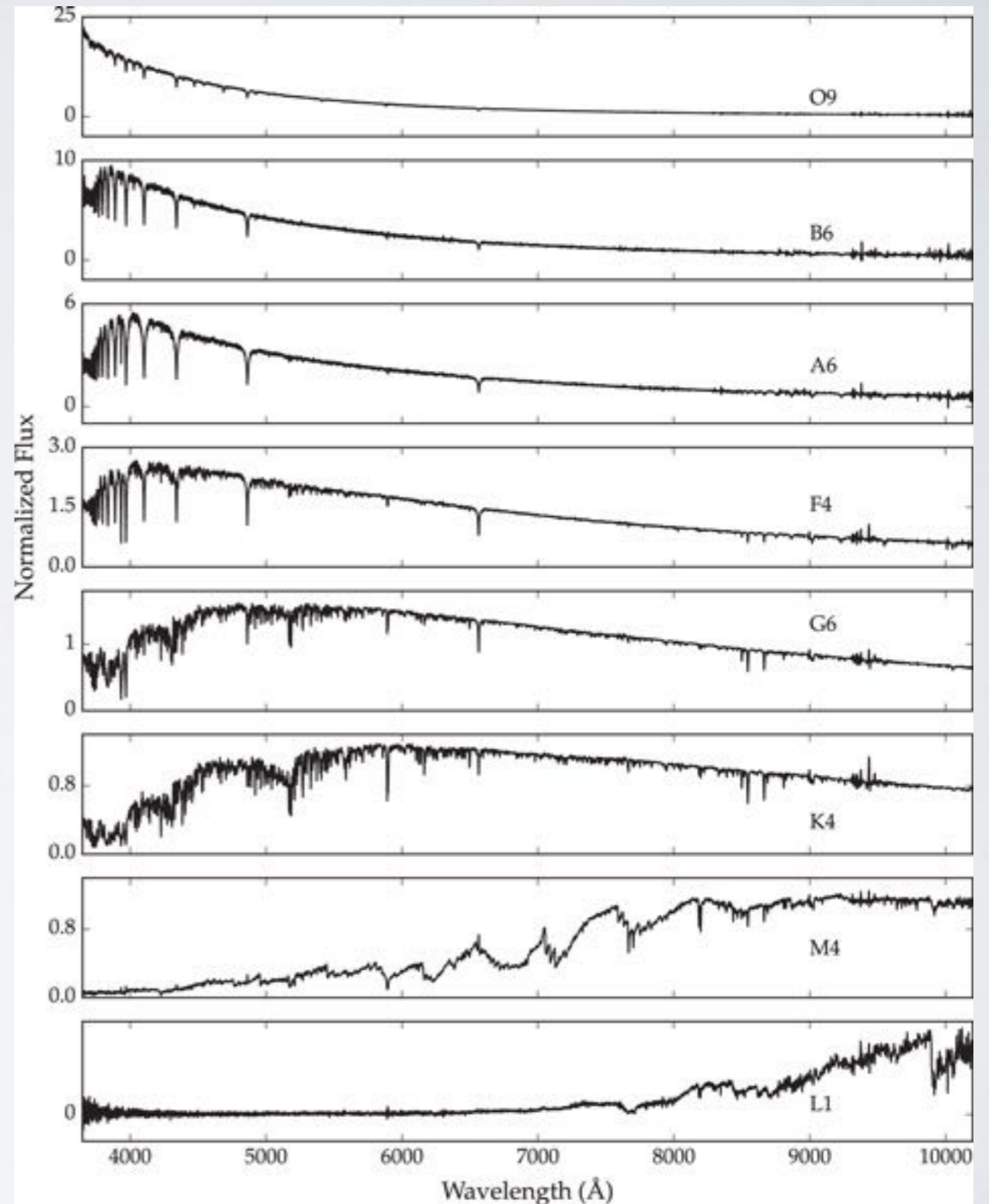
- Fundamentally qualitative.
- The boundaries between spectral types are arbitrary and **depend on spectral resolution**
  - K-M transition is the onset of oxide molecular features.
  - But the Sun has oxide molecular features at high resolution...
  - M-L transition is **not** a substellar transition (more on that this afternoon).



From PYHAMMER (Kesseli et al. 2017)

# SPECTRAL TYPE: THE MERITS

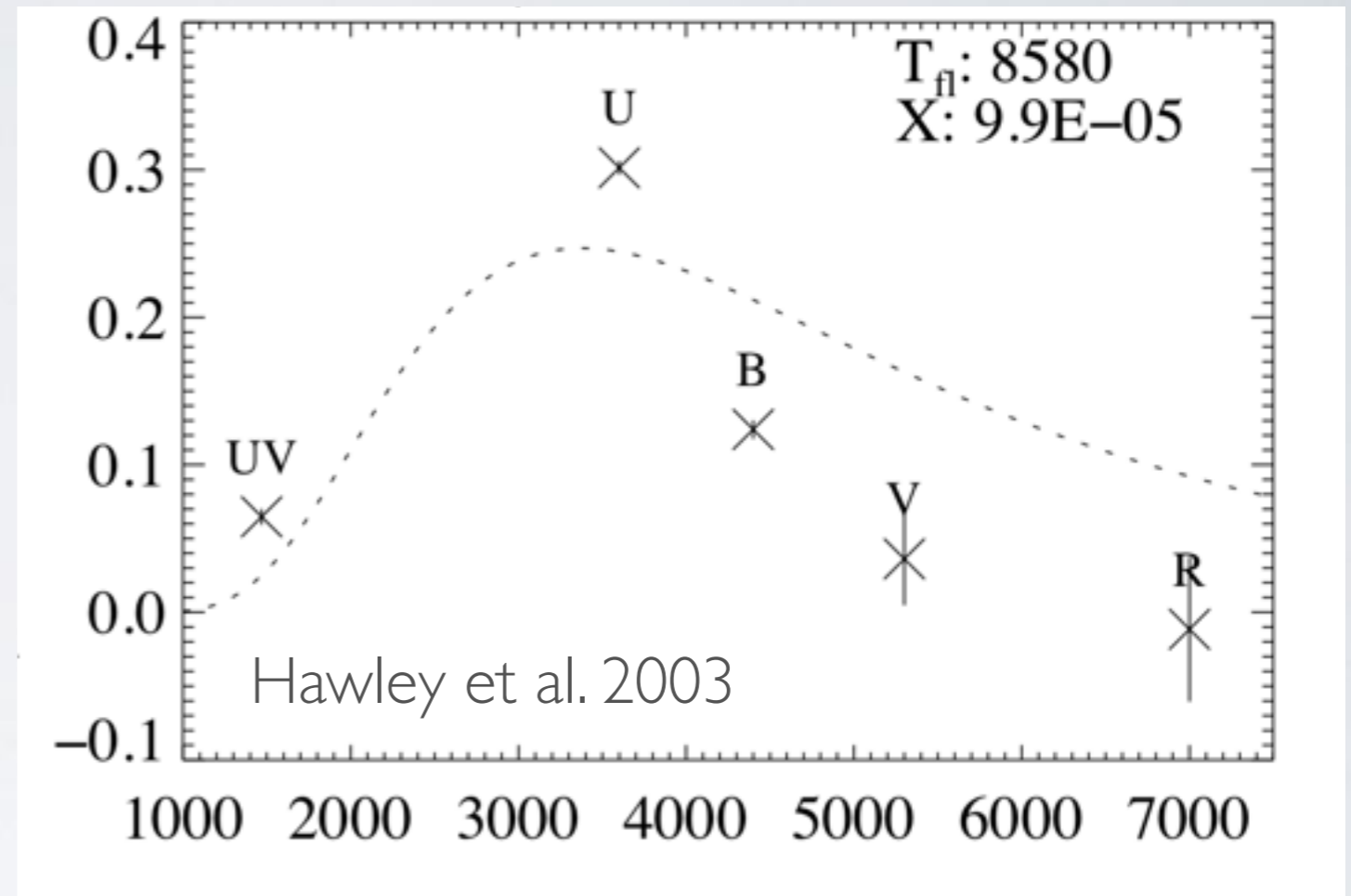
- **But it places your exoplanet hosts in context.**





# SPECTRAL TYPE: THE MERITS

- Consider that when AD Leo flares, it goes from an **M dwarf to an A star.**



What is the spectral type of Proxima Centauri during a flare?  
A young TRAPPIST?

(Ask Davenport et al.)

- Spectral Type

$$L_{\text{bol}} = 4\pi R^2 \sigma T_{\text{Eff}}^4$$

- **Effective  
temperature**

- Surface gravity

- Abundances

- Spectral Type
- **Effective temperature**
- Surface gravity
- Abundances

$$L_{\text{bol}} = 4\pi R^2 \sigma T_{\text{Eff}}^4$$

As defined, effective temperature is the **bolometric surface brightness** of a star in units of Kelvin

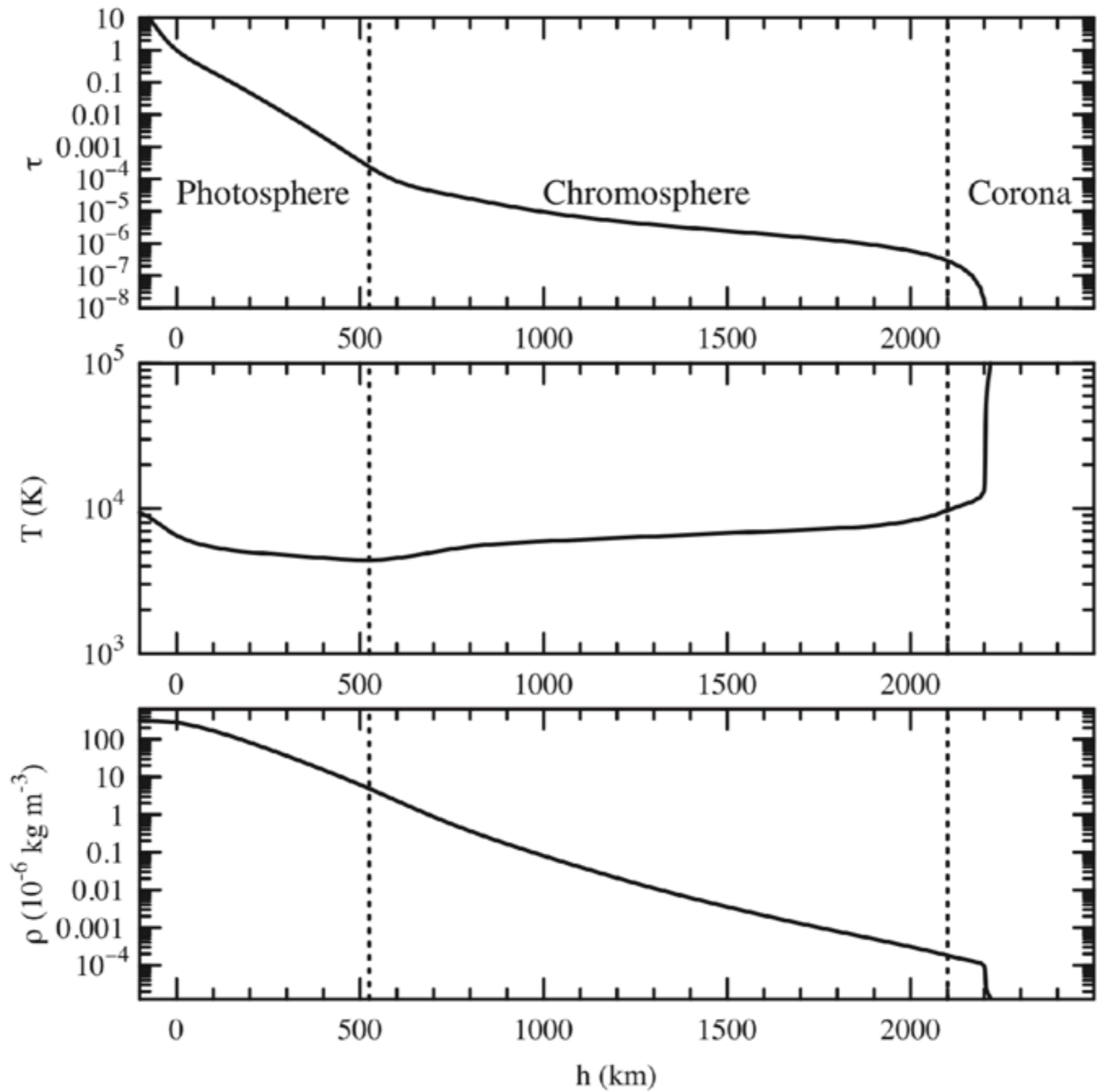


- Spectral Type
- **Effective temperature**
- Surface gravity
- Abundances

$$L_{\text{bol}} = 4\pi R^2 \sigma T_{\text{Eff}}^4$$

As defined, effective temperature is the **bolometric surface brightness** of a star in units of Kelvin

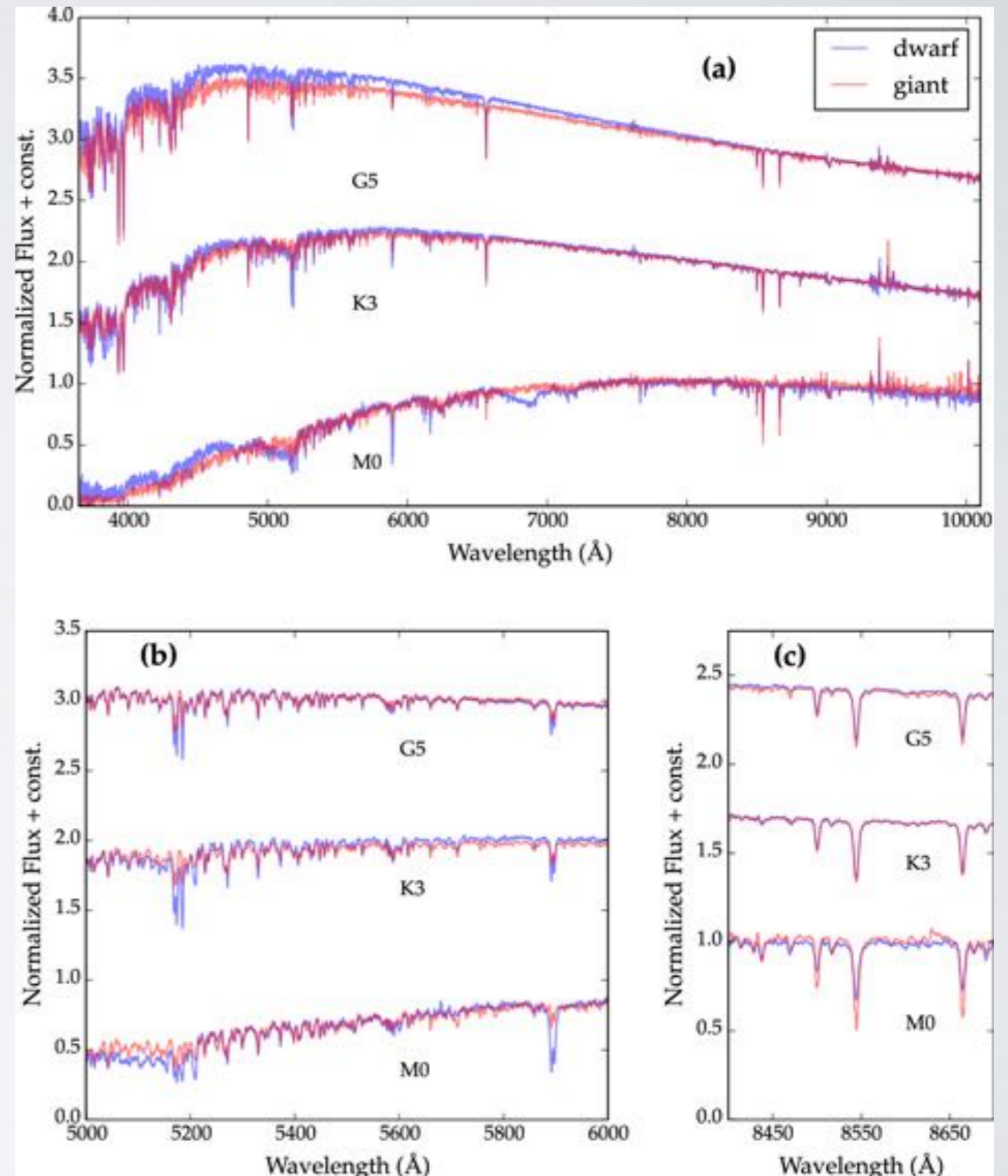
Historically inferred from from the shape of a spectrum or a color (B-V)



Solar Profiles from B. Ryden's Textbook

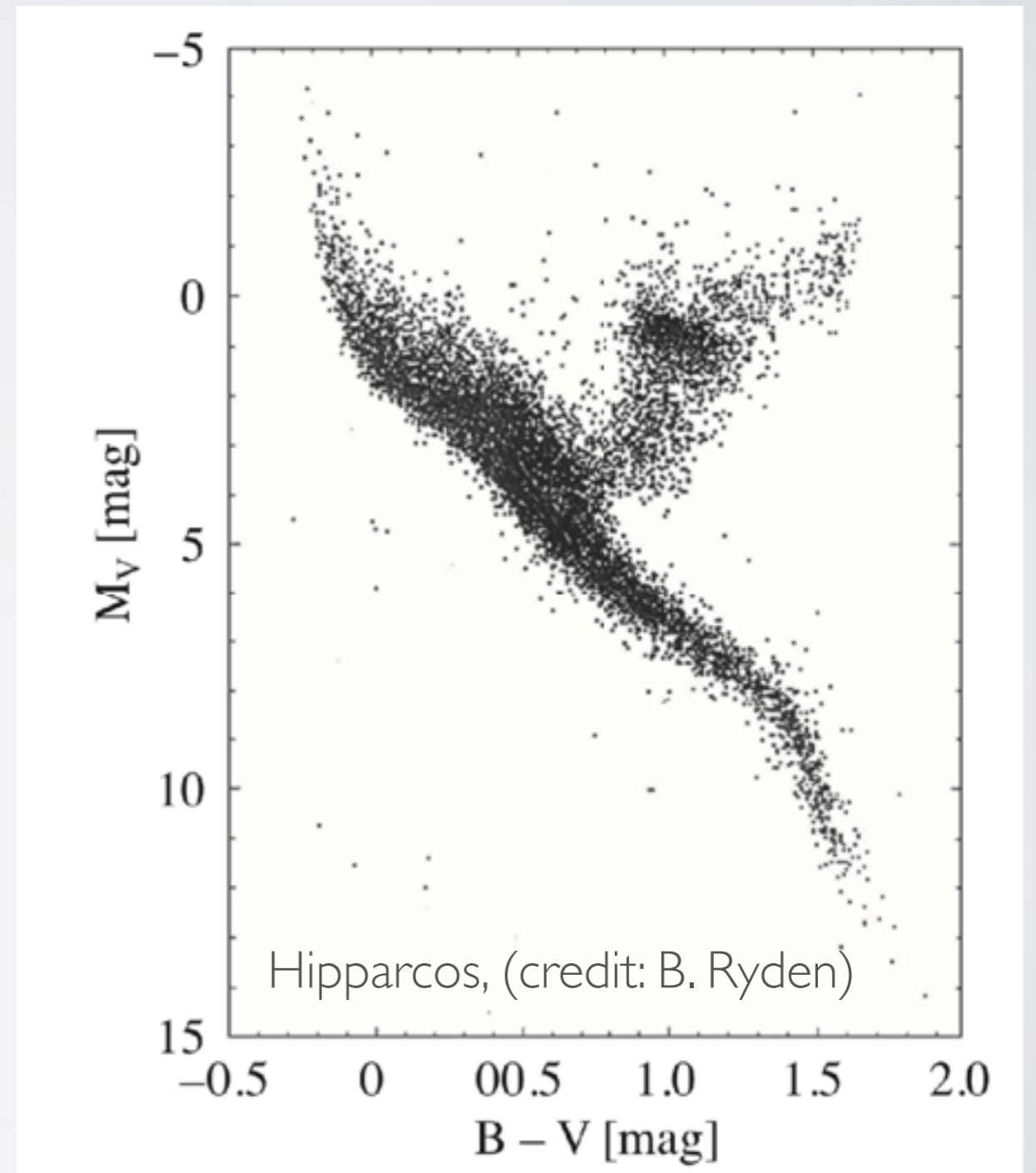
# DWARF-GIANT DISCRIMINATION: BY EYE

- Spectral Type
- Effective temperature
- **Surface gravity**
- Abundances



Precise  $\log(g)$  historically deduced from the location on a HR diagram (requiring a **parallax**)

- Spectral Type
- Effective temperature
- **Surface gravity**
- Abundances





With  **$T_{\text{Eff}}$**  (from **color**) and  **$\log(g)$**  (from **parallax**), a high-resolution spectrum can tell you the abundances from the **curve of growth**

- Spectral Type
- Effective temperature
- Surface gravity
- **Abundances**

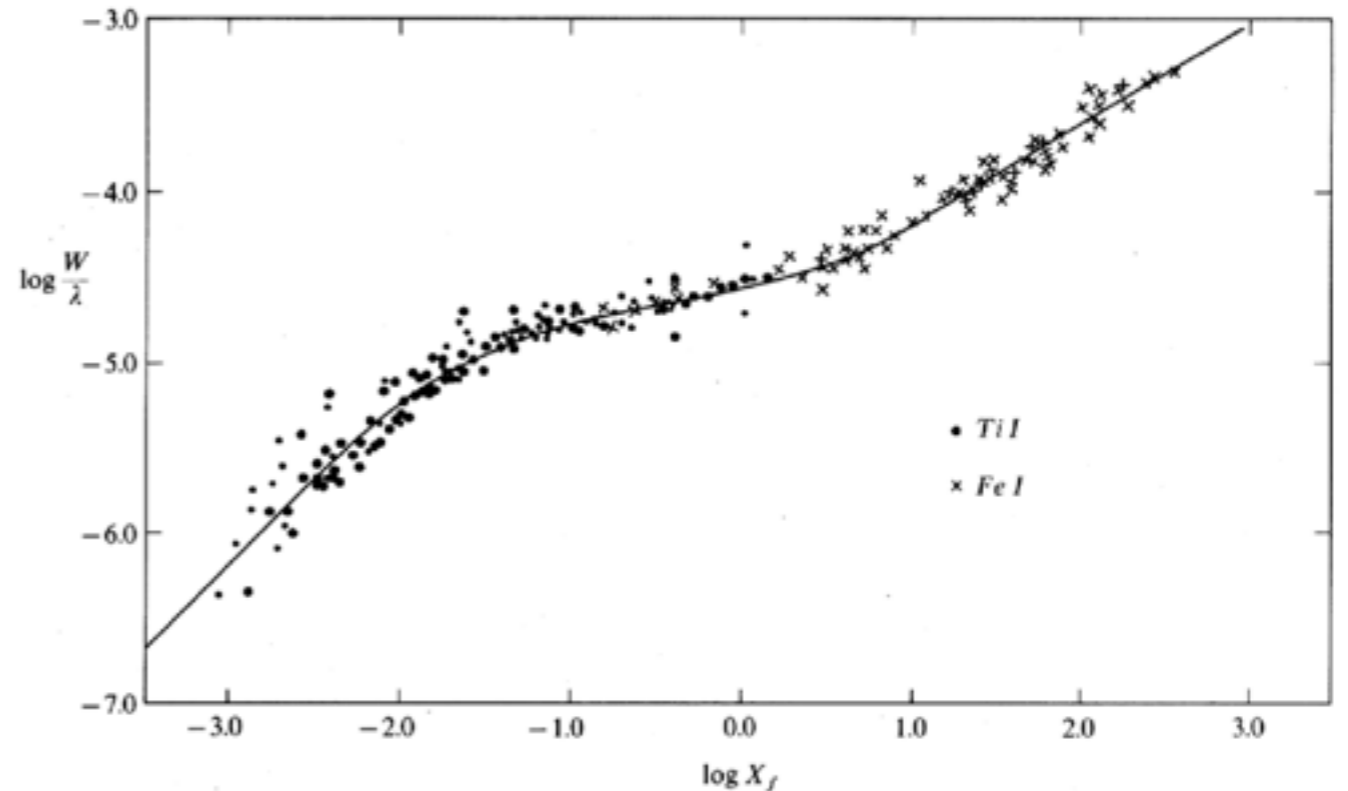


Figure 9.4: Empirical curve of growth for solar Fe I and Ti I lines. Taken from Mihalas (1970) who took it from Wright (1948). Wright measured the equivalent widths of 700 lines in the Utrecht Atlas.

The Old School  
Figure from Rutten (2003)

- Spectral Type
- **Effective temperature**
- **Surface gravity**
- **Abundances**

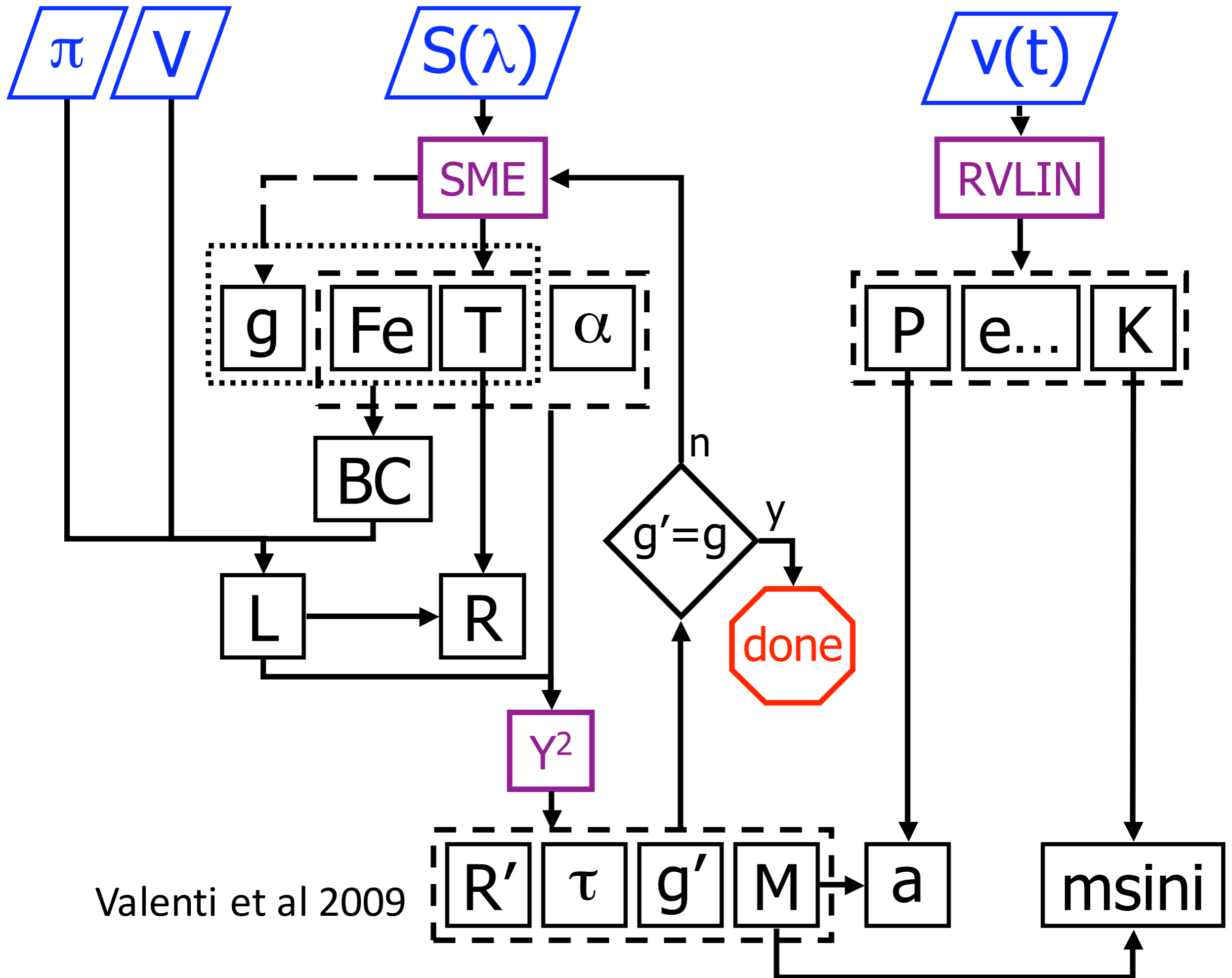
The New School (1990+)

Let's fit **all three at once**,  
directly from spectra.

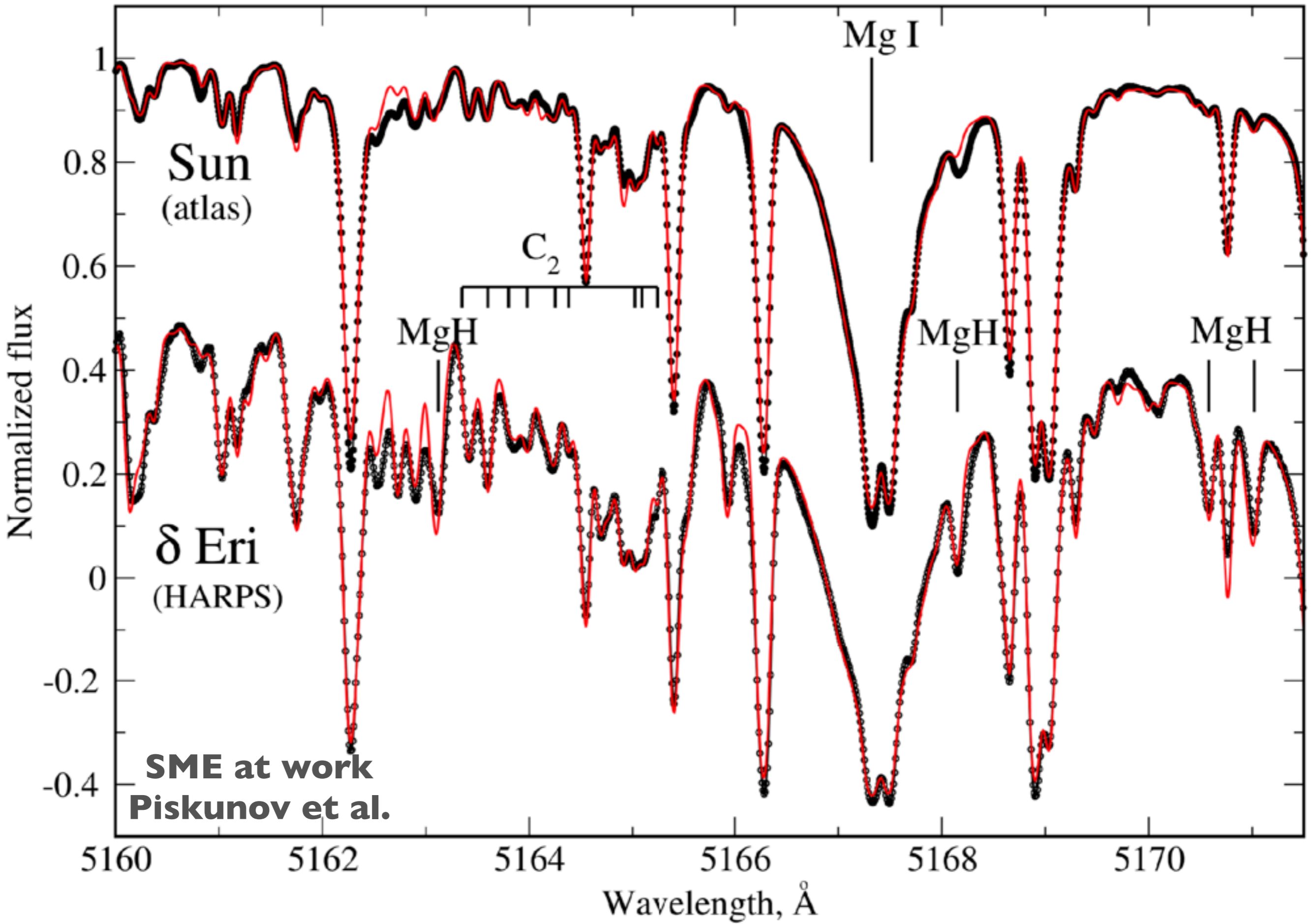
If you have a parallax, that helps,  
but not required.

E.G. Spectroscopy Made Easy  
(SME)

Similar approaches include SPC,  
VWA, ROTFIT



Valenti et al 2009





# ACCURATE GRAVITIES OF F, G, AND K STARS FROM HIGH RESOLUTION SPECTRA WITHOUT EXTERNAL CONSTRAINTS

JOHN M. BREWER<sup>1</sup>, DEBRA A. FISCHER<sup>1</sup>, SARBANI BASU<sup>1</sup>, JEFF A. VALENTI<sup>2</sup>, AND NIKOLAI PISKUNOV<sup>3</sup>

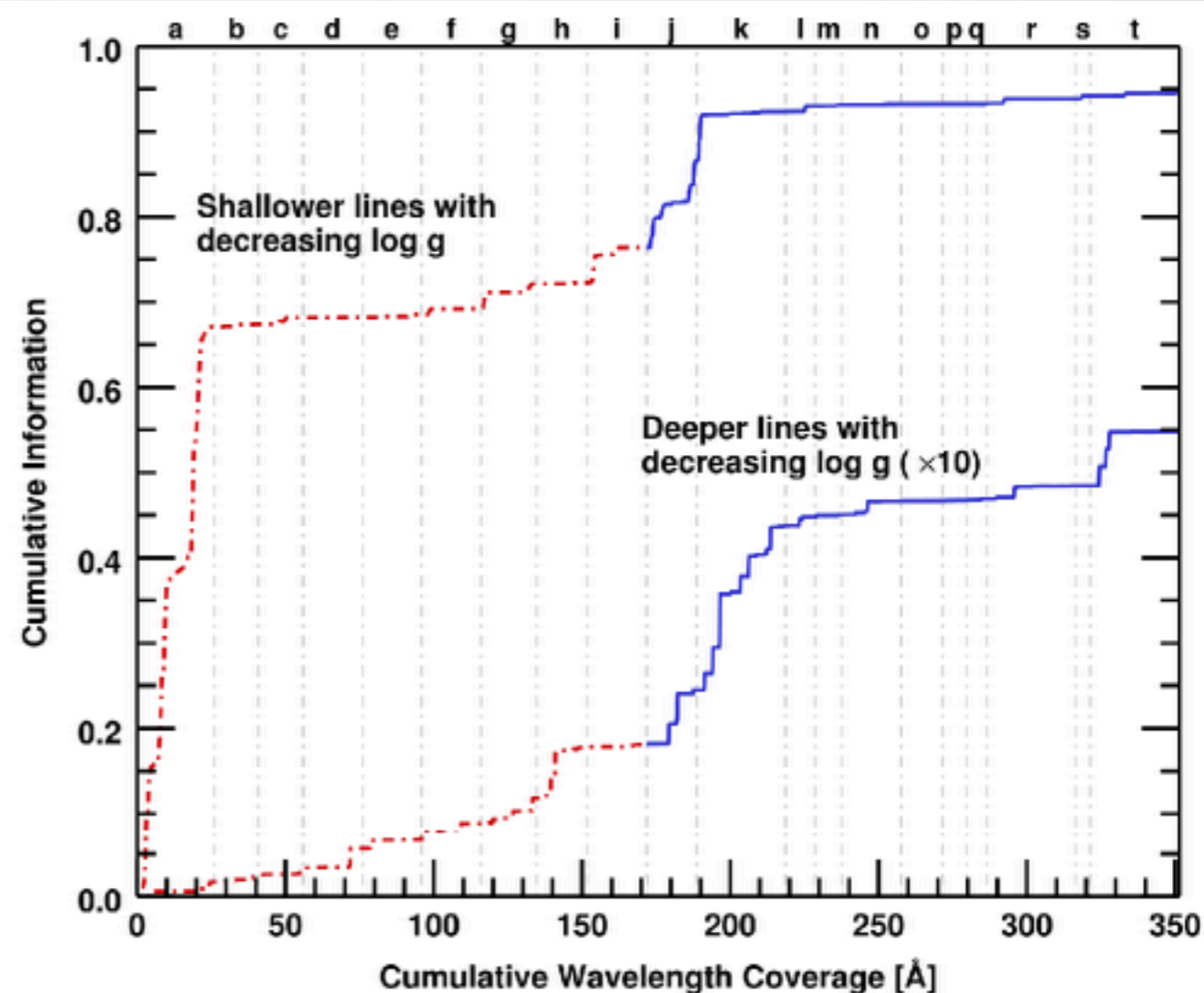
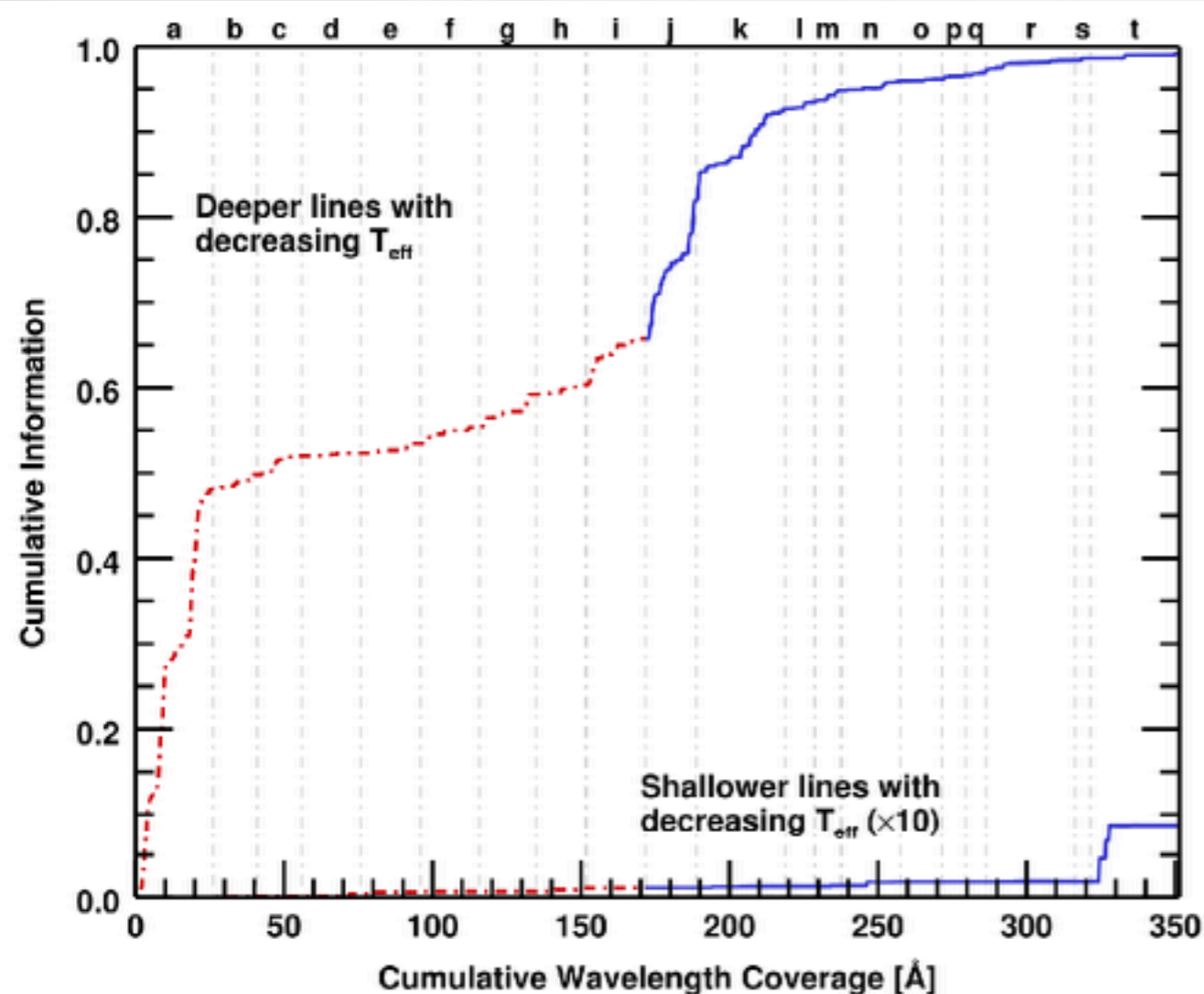
<sup>1</sup> Department of Astronomy, Yale University, 260 Whitney Avenue, New Haven, CT 06511, USA;

[john.brewer@yale.edu](mailto:john.brewer@yale.edu), [debra.fischer@yale.edu](mailto:debra.fischer@yale.edu), [sarbani.basu@yale.edu](mailto:sarbani.basu@yale.edu)

<sup>2</sup> Space Telescope Science Institute, 3700 San Martin Drive, Baltimore, MD 21218, USA; [valenti@stsci.edu](mailto:valenti@stsci.edu)

<sup>3</sup> Uppsala University, Department of Physics and Astronomy, Box 516, SE-75120 Uppsala, Sweden; [nikolai.piskunov@physics.uu.se](mailto:nikolai.piskunov@physics.uu.se)

Received 2014 December 22; accepted 2015 March 30; published 2015 May 28



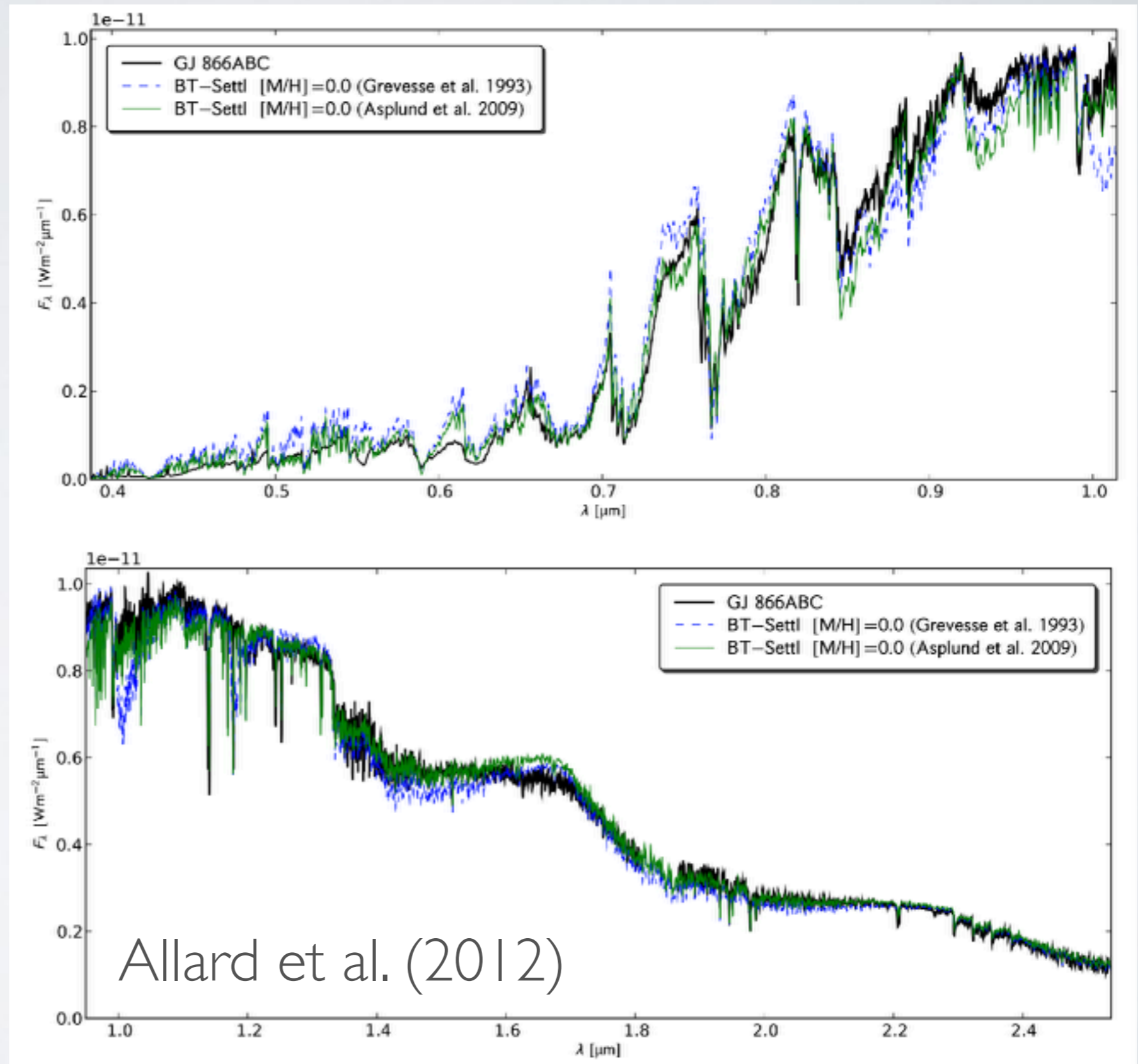
- Spectral Type
- **Effective temperature**
- **Surface gravity**
- **Abundances**

**For M dwarfs, this approach is not as straightforward.**

**But there has been substantial progress over the last decade.**

# M DWARF SPECTROSCOPY

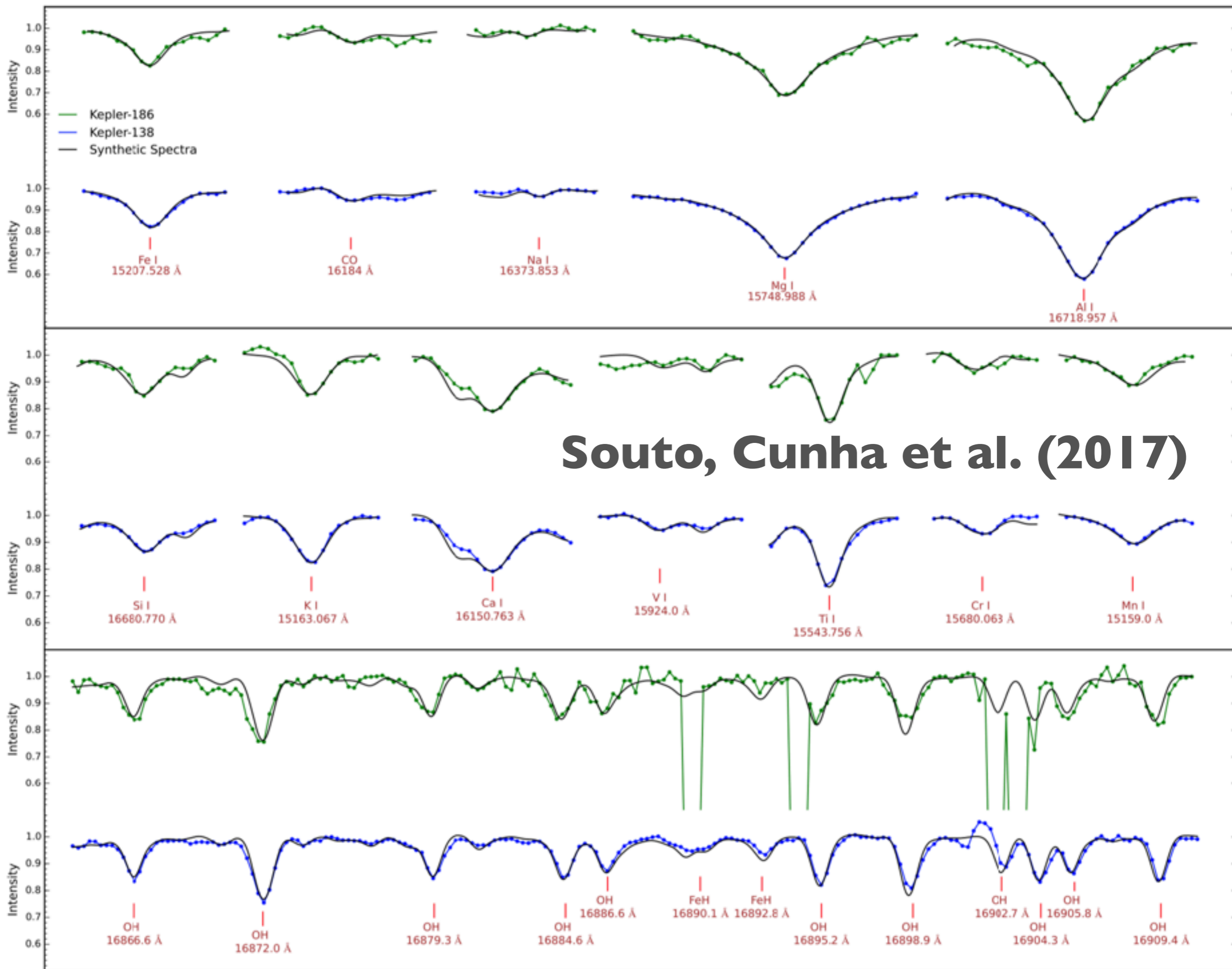
- Continuum opacity sources no longer dominate
  - Not enough electrons for H-
- Opacities are blended molecular transitions



# M DWARF SPECTROSCOPY

- Two approaches:
  - **Empirically calibrate spectral indices** to  $T_{\text{eff}}$ ,  $\log(g)$  and abundances using FGK + M systems
    - Bonfils et al., Rojas-Ayala et al., Mann et al., Newton et al., Terrien et al.
    - Errors in FGK analysis are propagated!
  - **Fit models directly to spectra**
    - Souto, Cunha et al., Tsuji et al., Tsuji & Nakajima





- Spectral Type
- **Effective temperature**
- **Surface gravity**
- **Abundances**

The Newer New School  
(2010+)

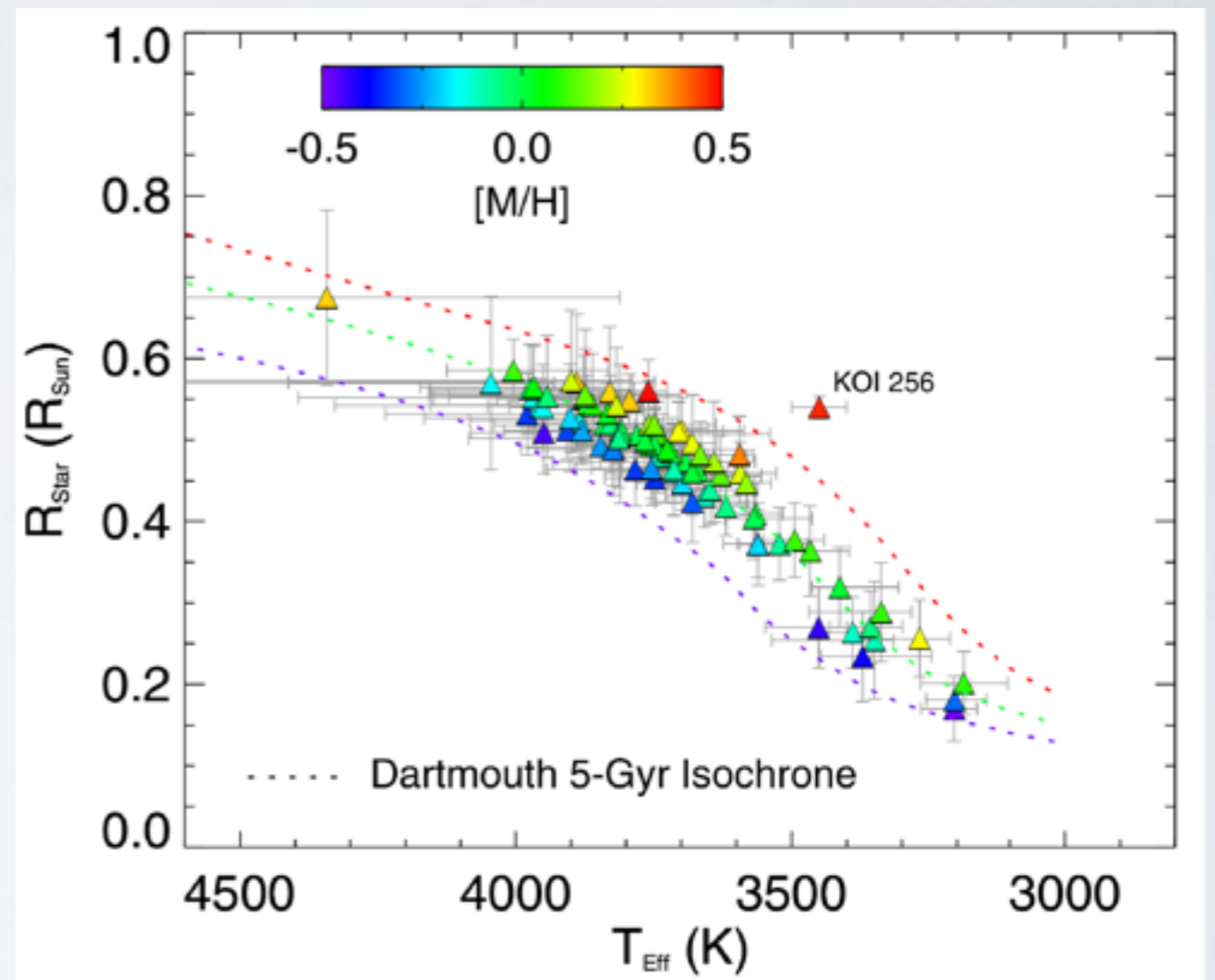
Combined measured spectra of  
touchstone stars to match  
measured spectrum of the target.

**SpecMatch:** Petigura et al.  
(2017)

Applied to Barnard's Star (M4)

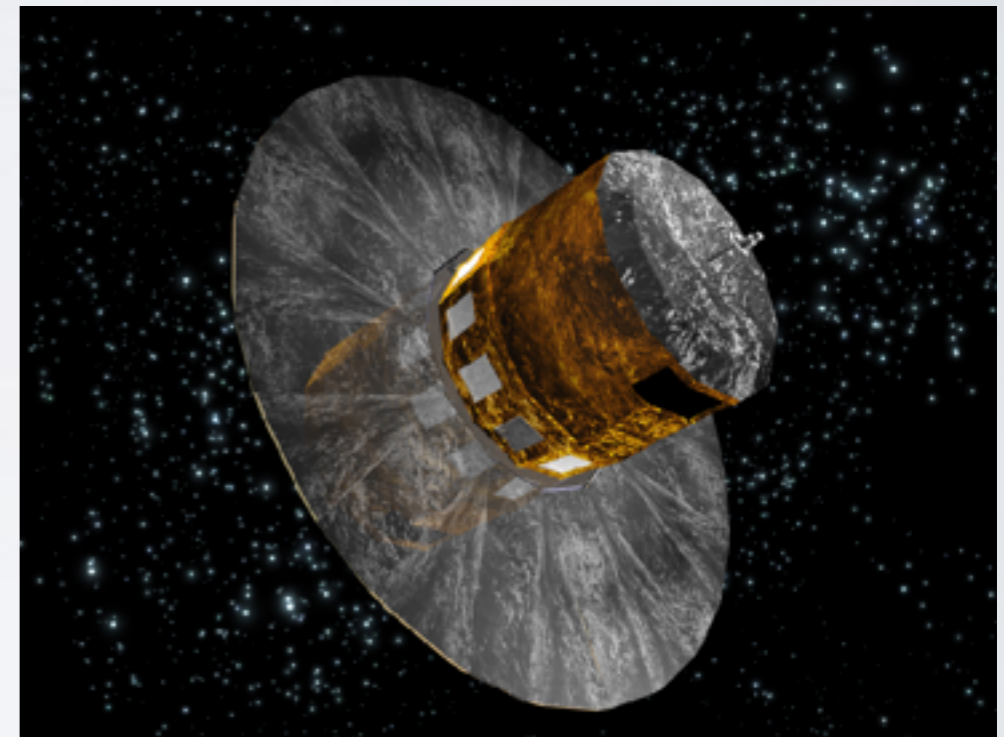
# ATMOSPHERE MODELS + EVOLUTIONARY MODELS

- By combining best fitted atmosphere parameters with predictions from **evolutionary** models, stellar mass, radius and age can be determined.
- (Just remember, evolutionary models have atmosphere models *built in*)



# ABUNDANCES, ABUNDANCES, ABUNDANCES

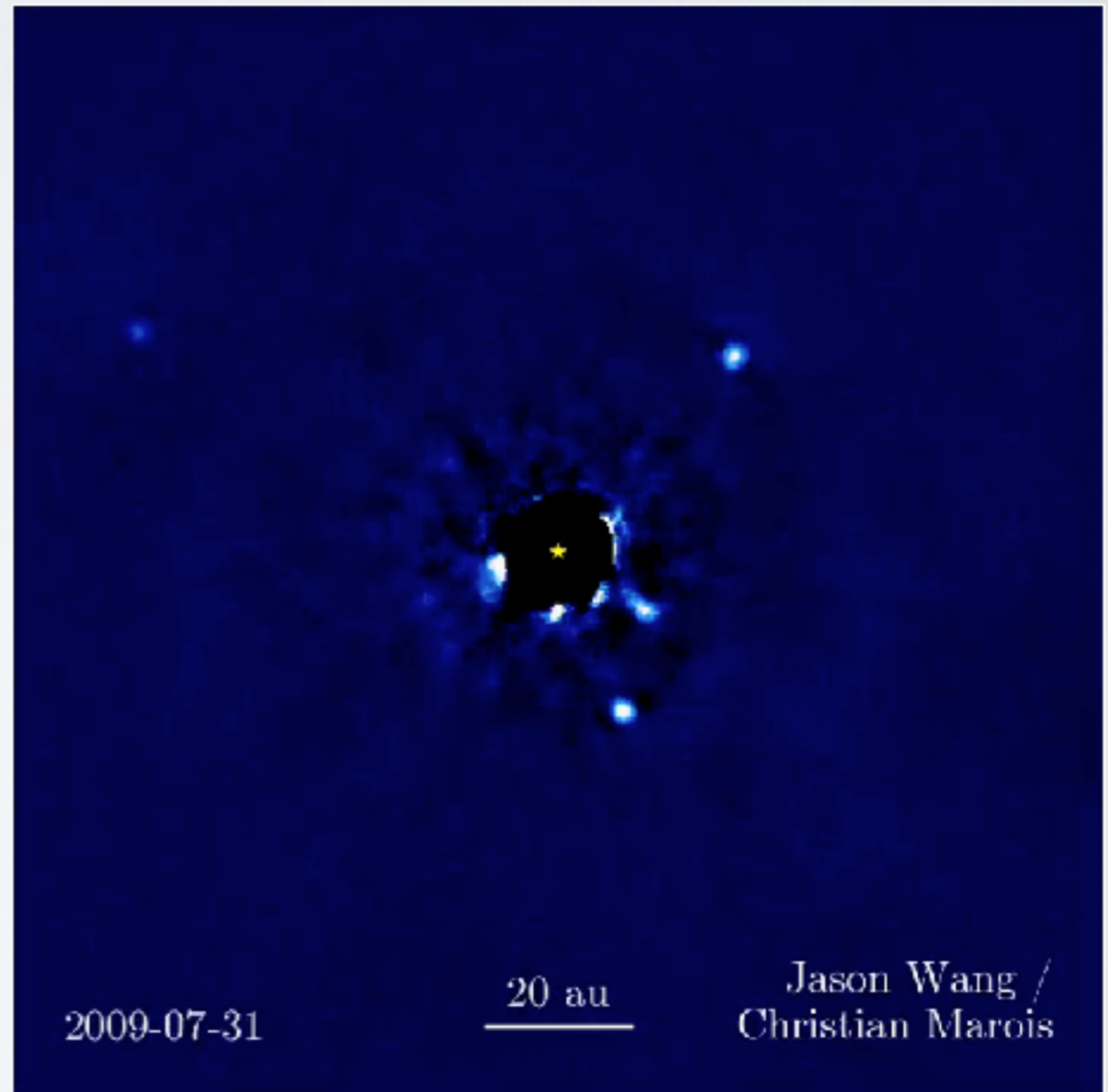
- With Gaia luminosities on the horizon, abundances become the most important stellar parameter from spectroscopy.
- Trigonometric parallaxes are **empirically calibrated** to masses and radii for main-sequence stars.
- Spectroscopy becomes less useful in this regard, but **abundances** are still critical.





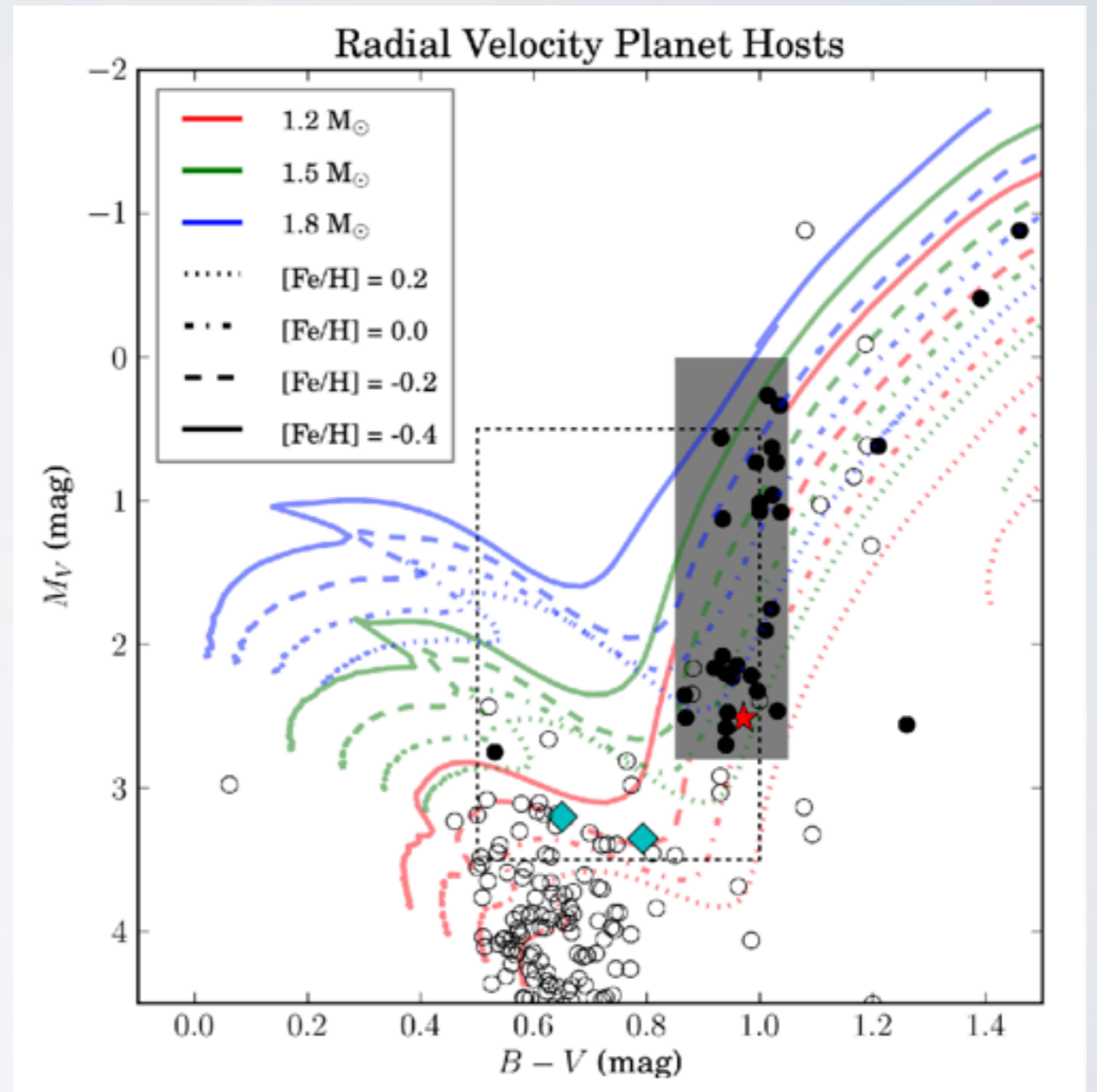
# ABUNDANCES: FORMATION MECHANISMS FOR DIRECTLY IMAGED PLANETS

- Do directly imaged planets have the same C-to-O ratios as their host stars (indicating gravitational collapse)?
- Or different C-to-O ratios (indicating disk-based core-accretion)?
- Keck-NIRSPEC program led by M. Bryan



# ABUNDANCES: SOLVING THE SUB GIANT MASS CONTROVERSY

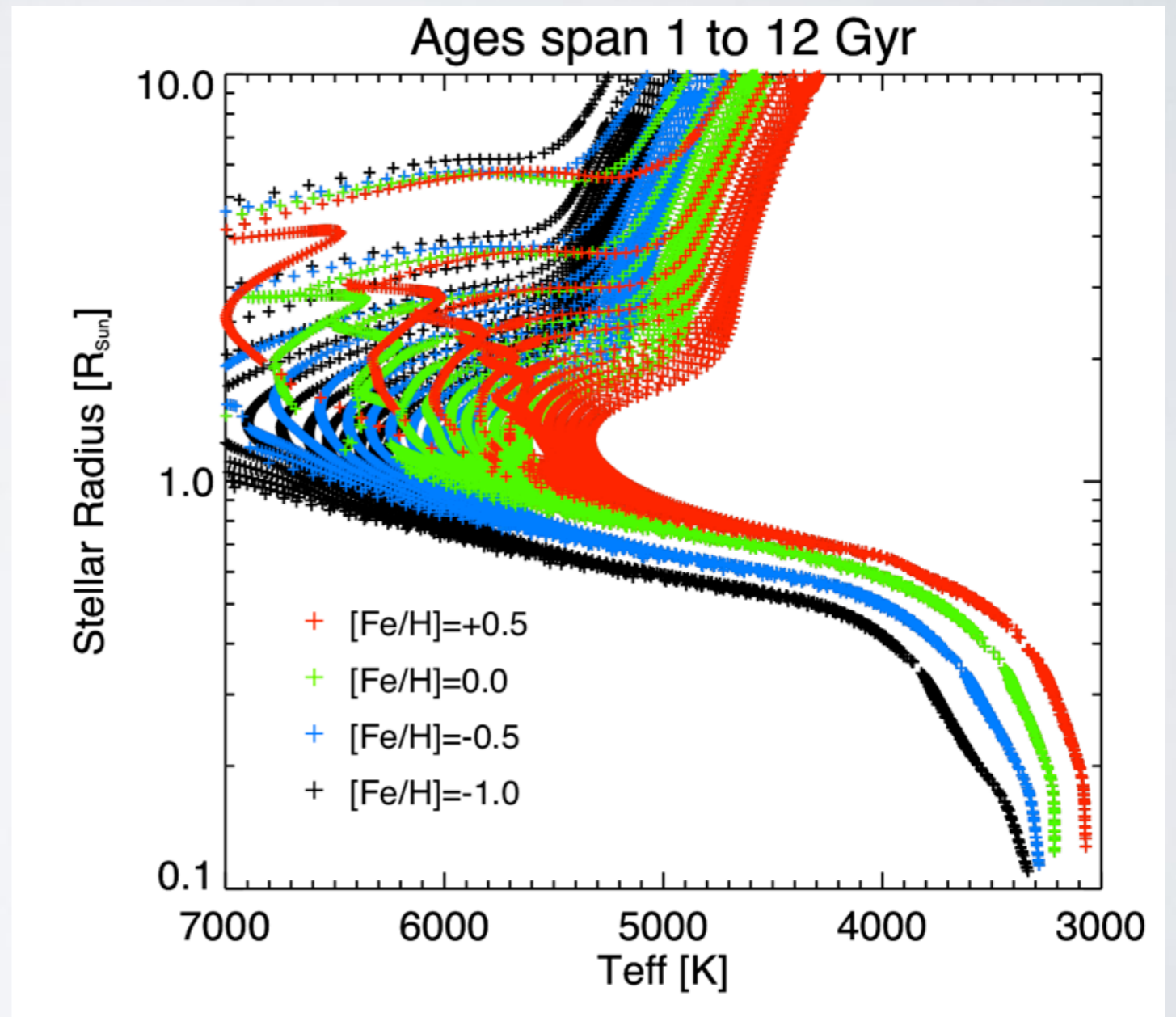
- Lloyd 2011 argued that sub-giant exoplanet host masses from Johnson et al. are overestimated.
- Implicit to the argument is that the sub-giant abundances are systematically in error.



Lloyd 2011

# ABUNDANCES: AGING FGK STARS

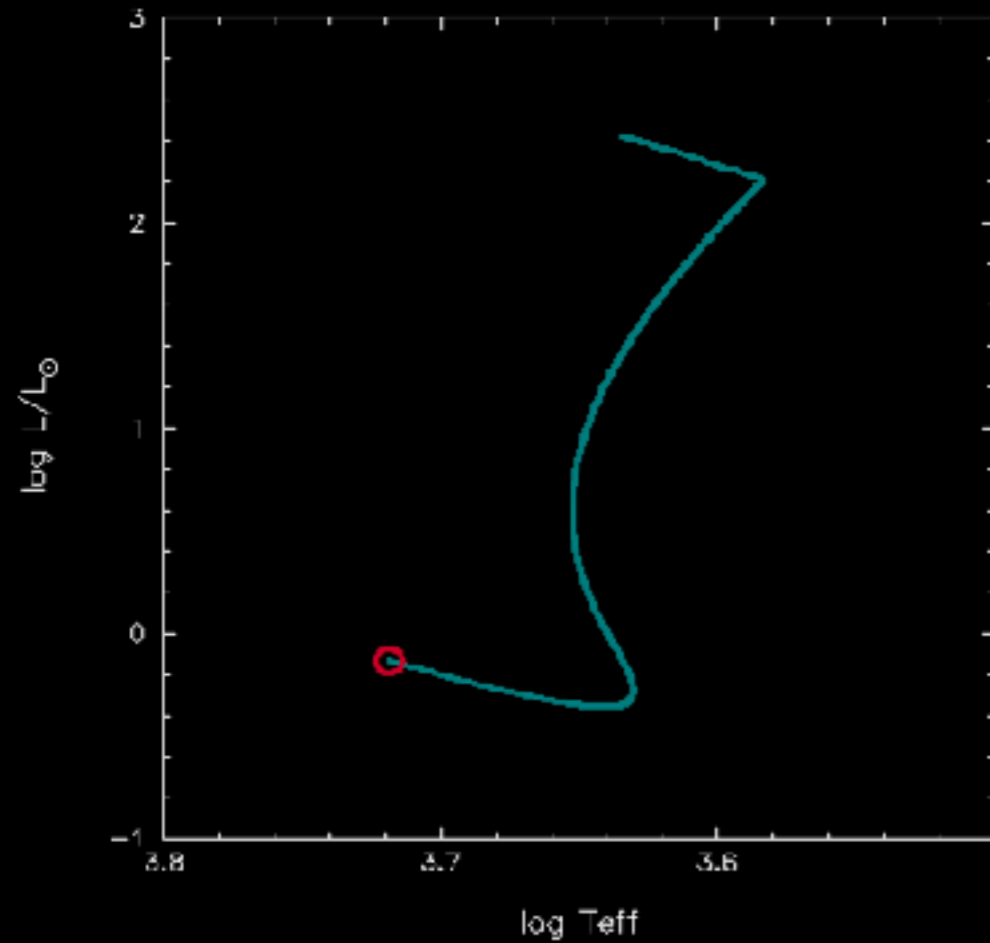
- In the absence of asteroseismic data, metallicity is required to determine stellar ages.
- Dartmouth Evolutionary models



age 2.439778e7 yrs

HR

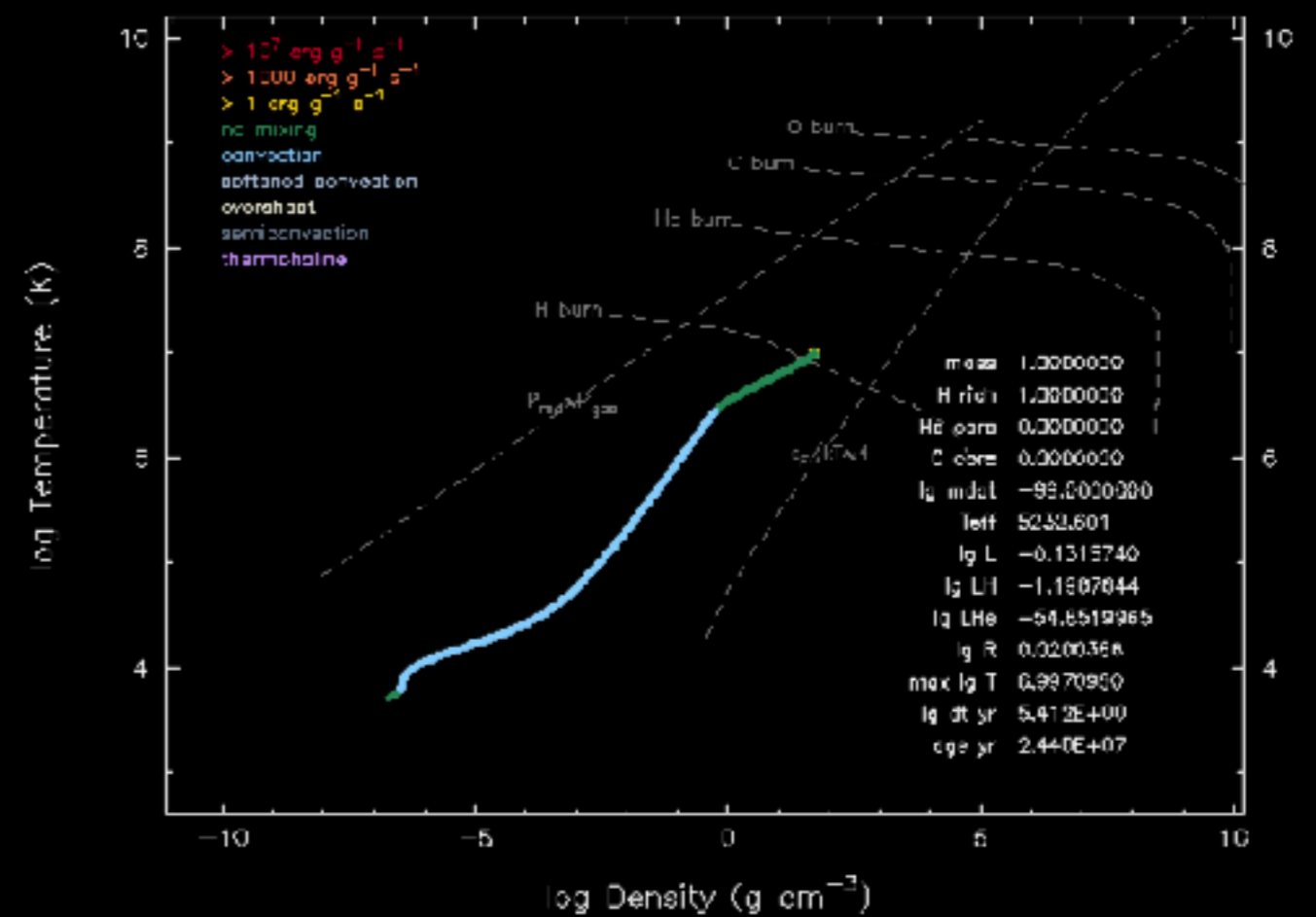
model 719



age 2.439778e7 yrs

TRho\_Profile

model 719



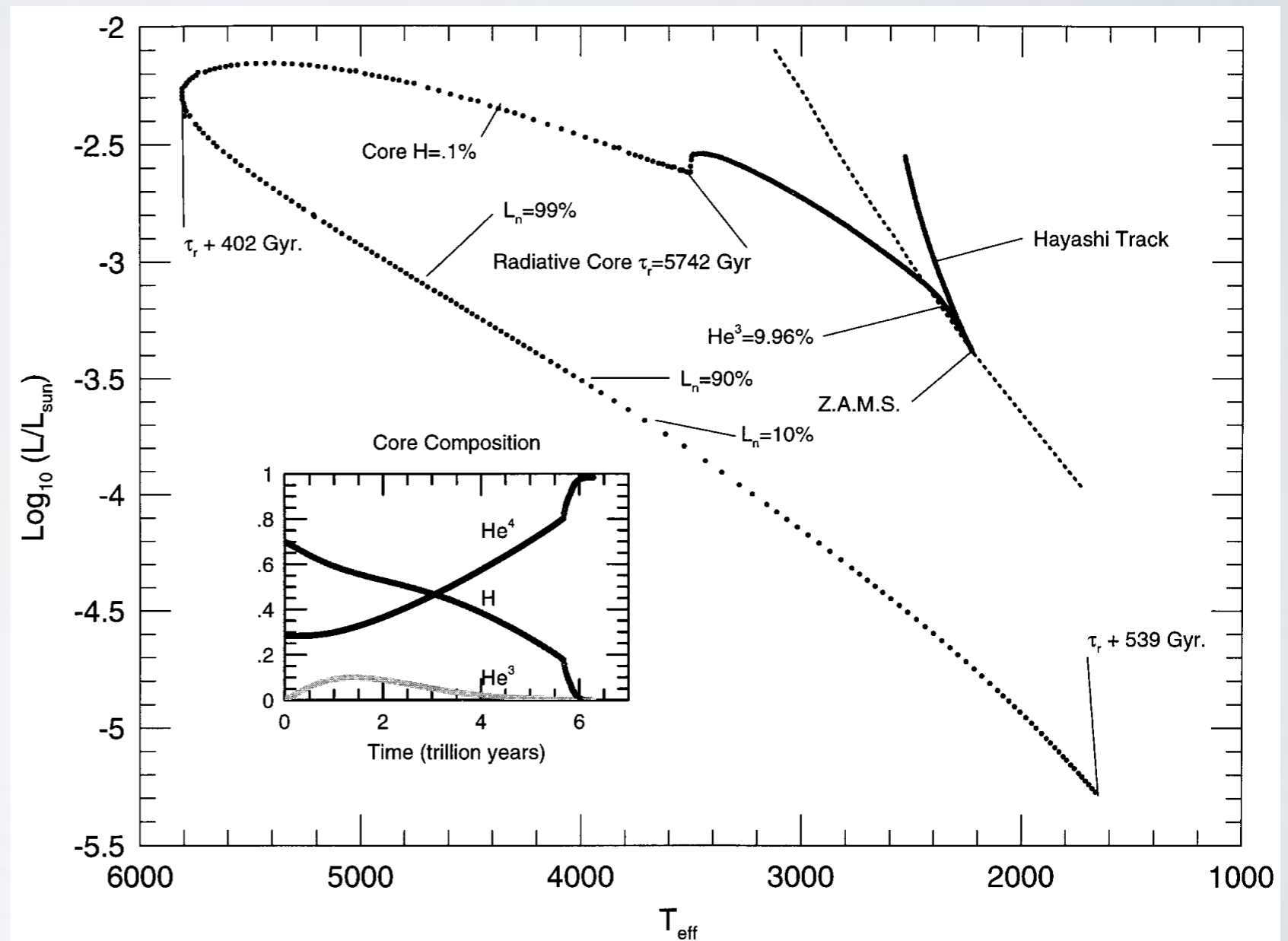
## MESA Model of a Sun-like Star

(I ran it this morning. It's super easy.)



# ABUNDANCES: MEASURING M DWARF AGES

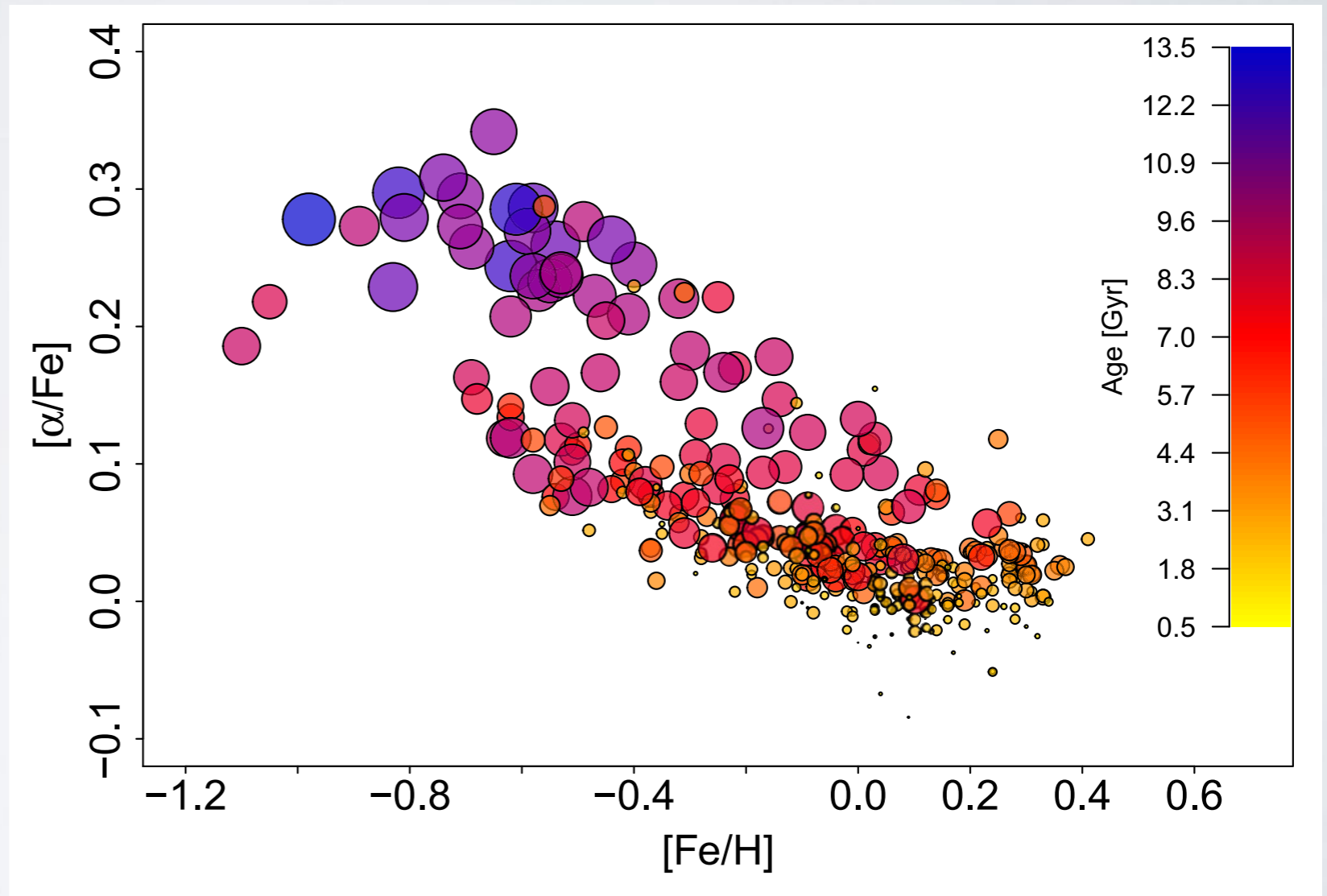
- M Dwarfs are notoriously difficult to age.
- Change by less than 0.1% in luminosity and 1 Kelvin in  $T_{\text{eff}}$  every Gyr
- Compare to FGK stars ( $\sim 5\%$  in luminosity every Gyr)



Laughlin et al. (1997)

# ABUNDANCES: MEASURING M DWARF AGES

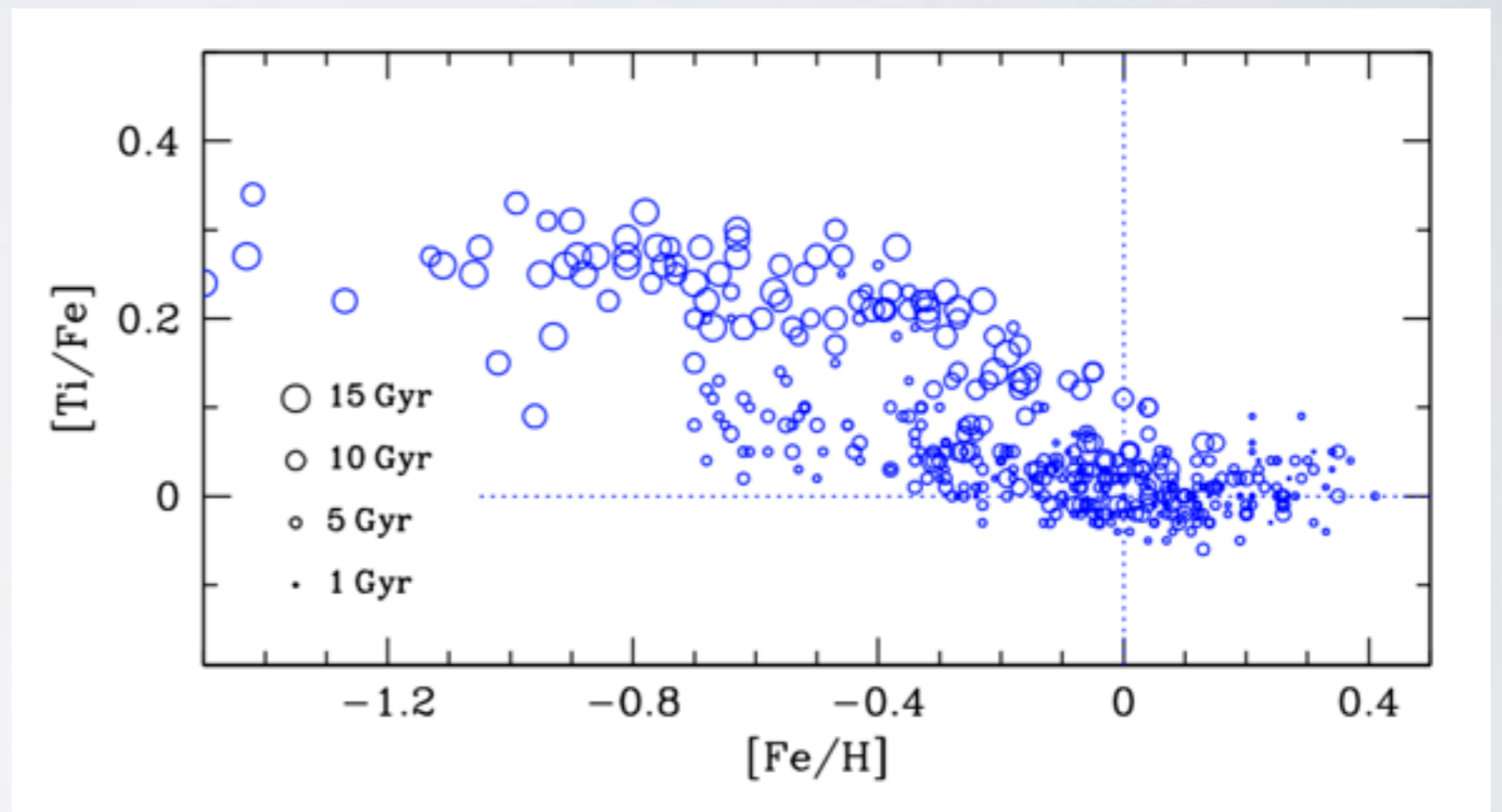
- If M dwarfs follow FGK trends, **alpha-enrichment** should age M dwarfs with uncertainties of 1 Gyr.



Haywood et al. 2013

# ABUNDANCES: MEASURING M DWARF AGES

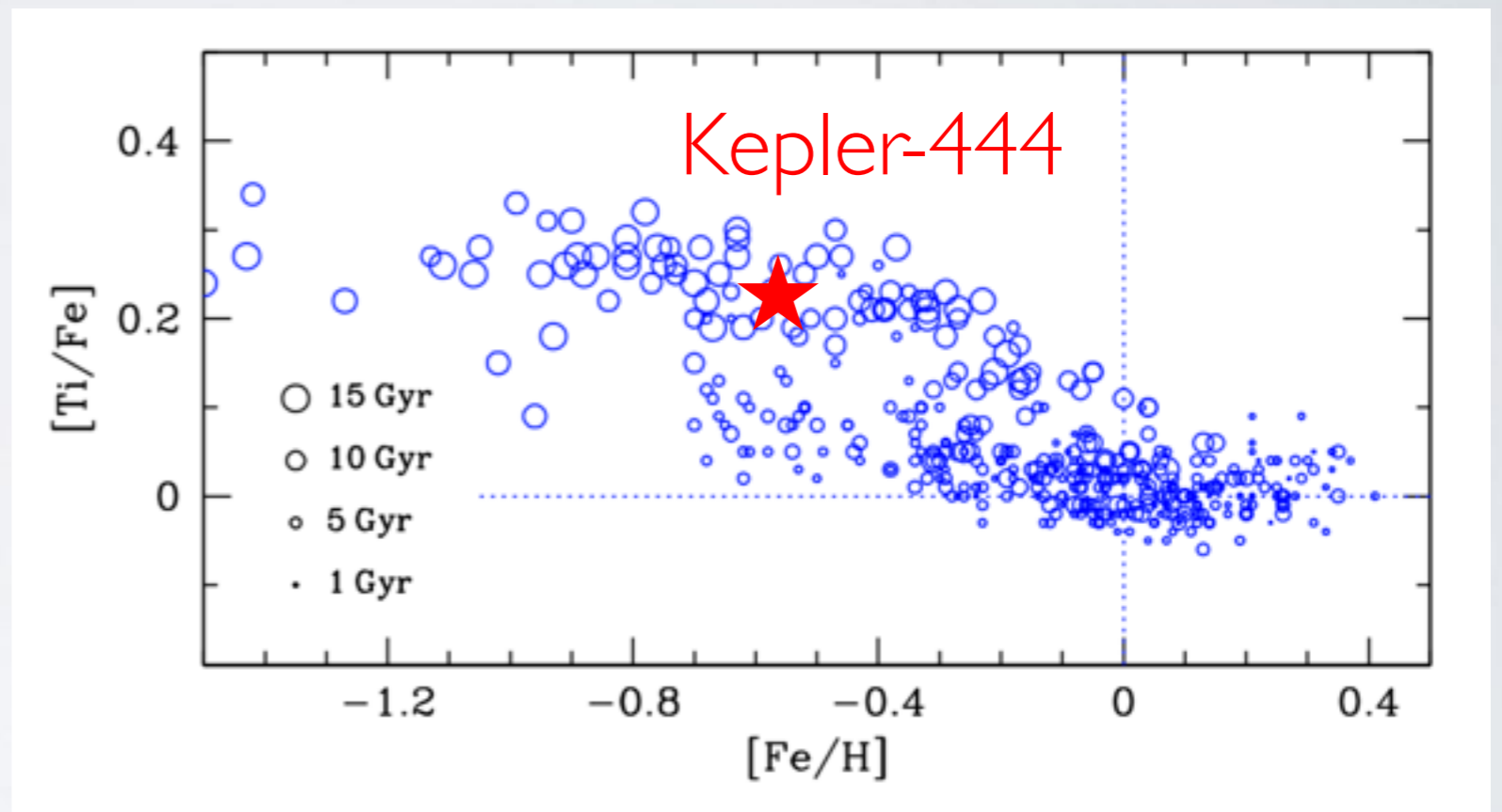
- If M dwarfs follow FGK trends, **alpha-enrichment** should age M dwarfs with uncertainties of 1 Gyr.



Similar correlations from Bensby et al. (2014)

# ABUNDANCES: MEASURING M DWARF AGES

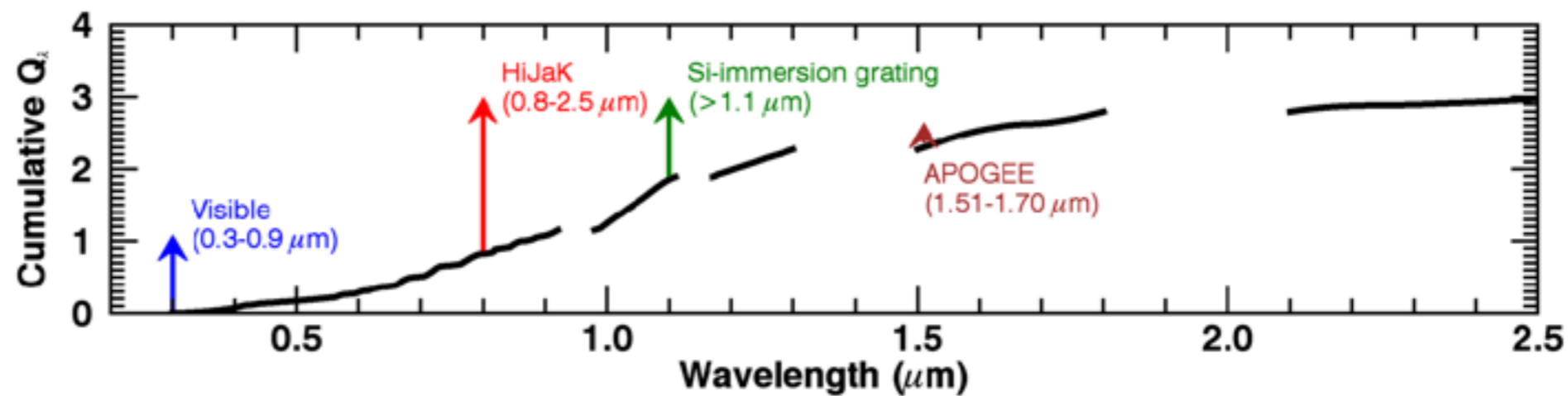
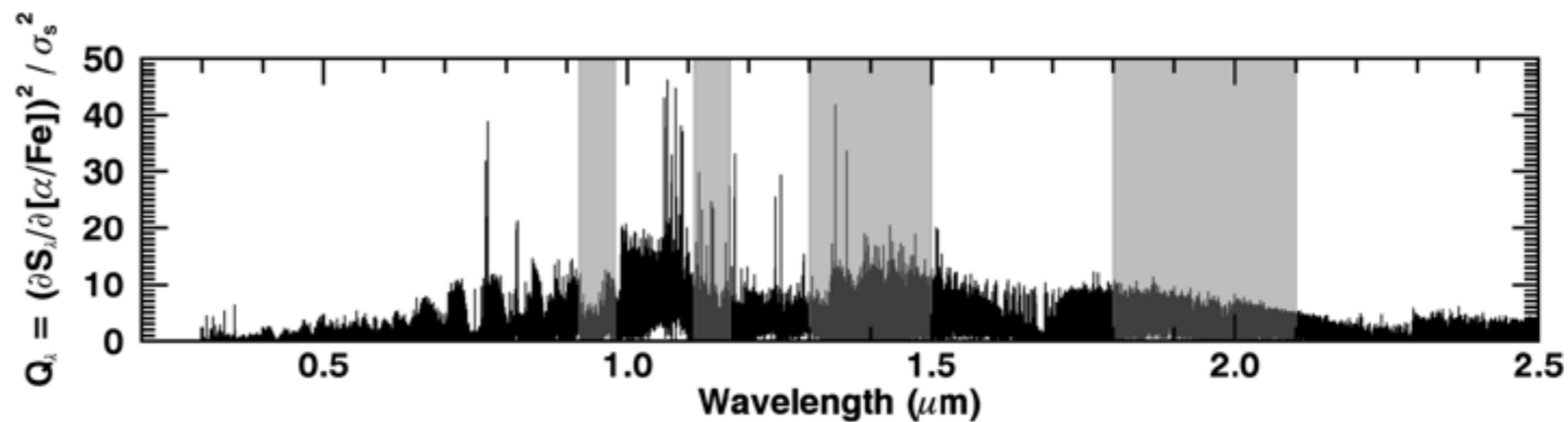
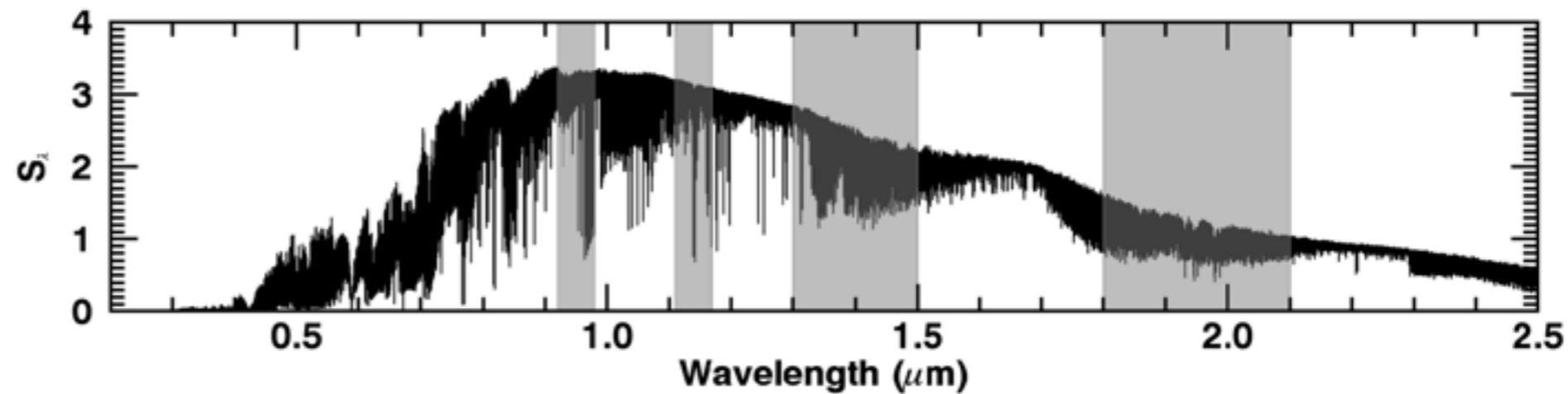
- If M dwarfs follow FGK trends, **alpha-enrichment** should age M dwarfs with uncertainties of 1 Gyr.



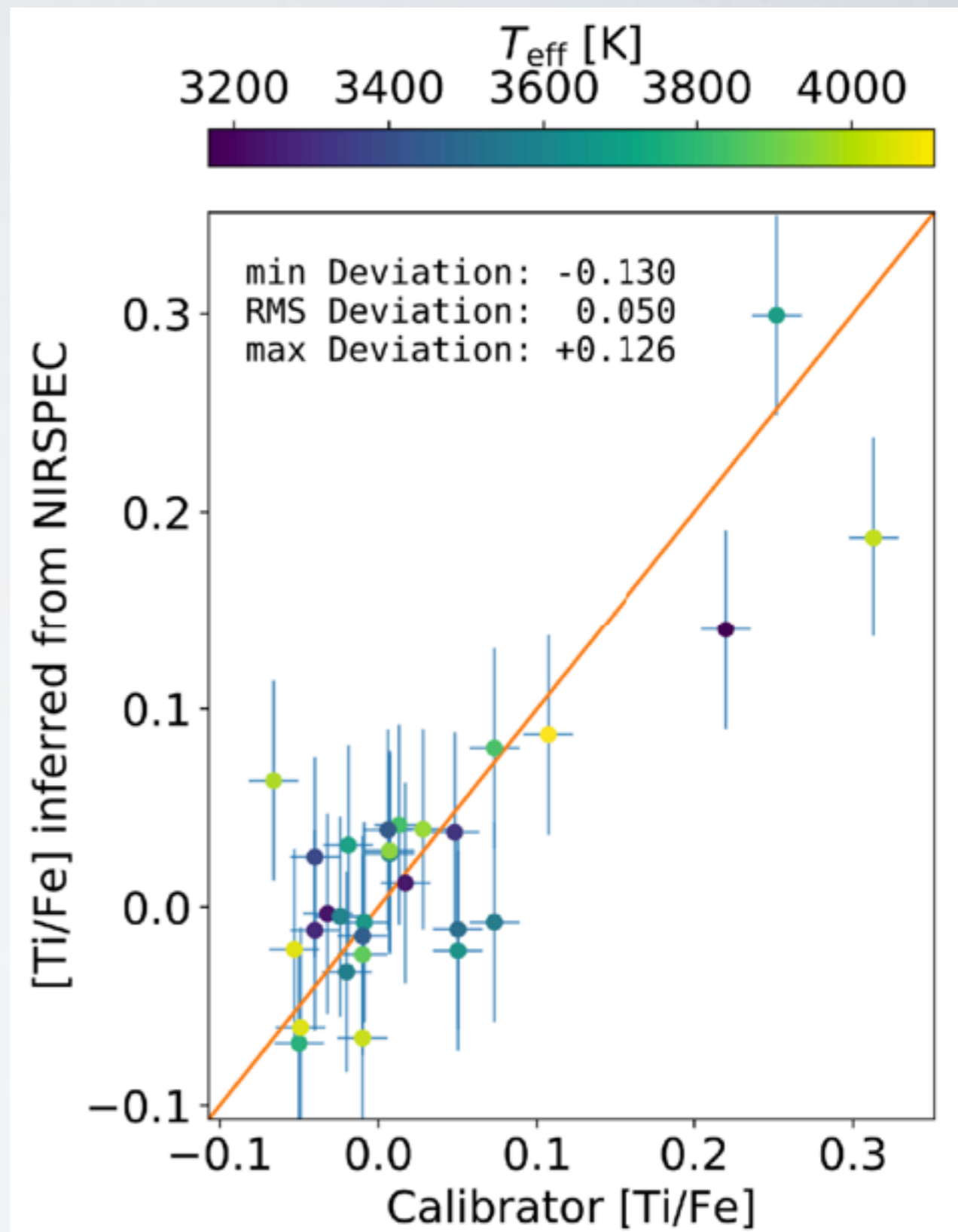
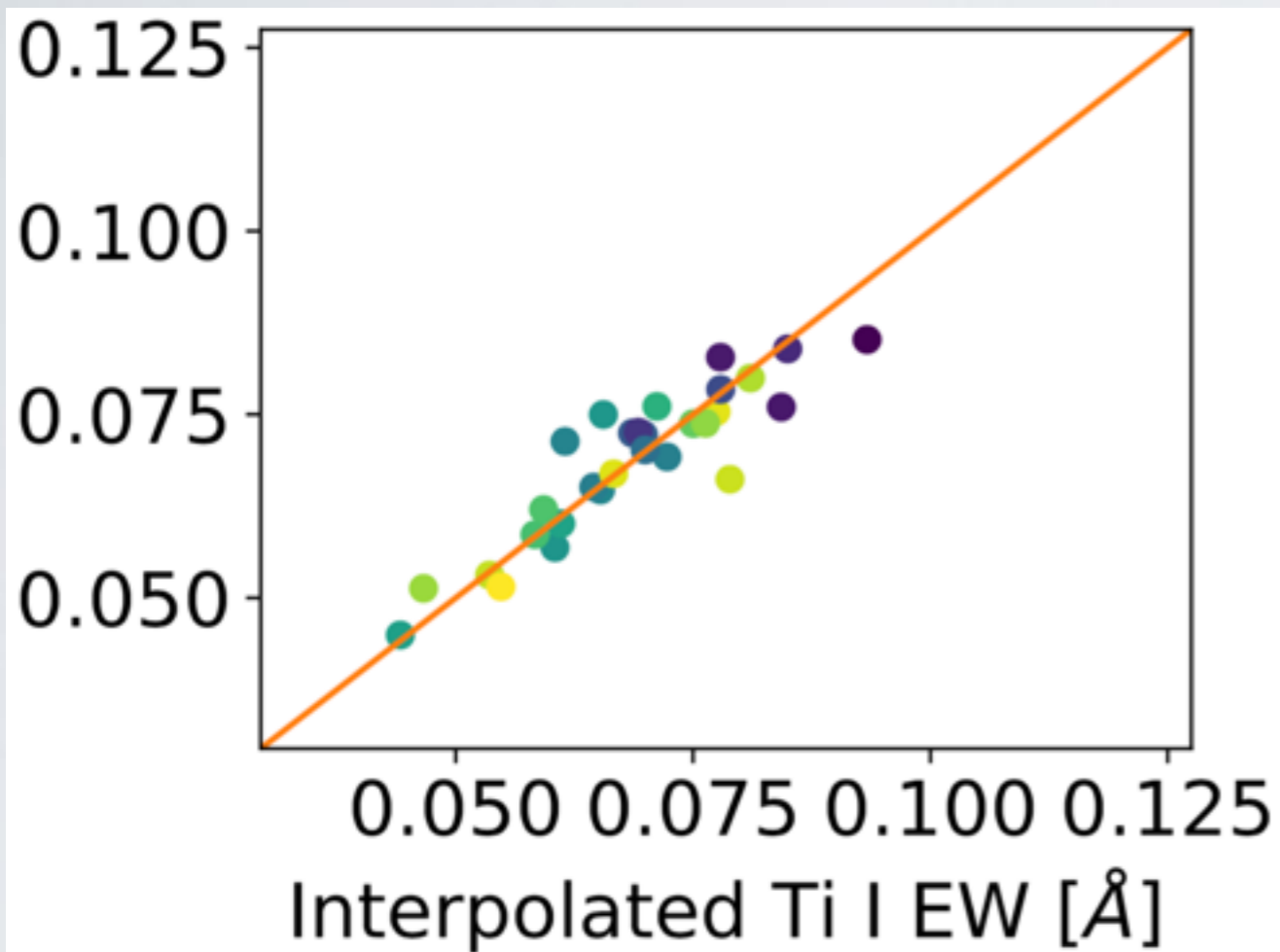
**“An ancient star with 5 Sub-Earths”  
Ti/Fe consistent with asteroseismic age  
Campante et al. (2015)**



Alpha content  
in M dwarfs  
vs. wavelength



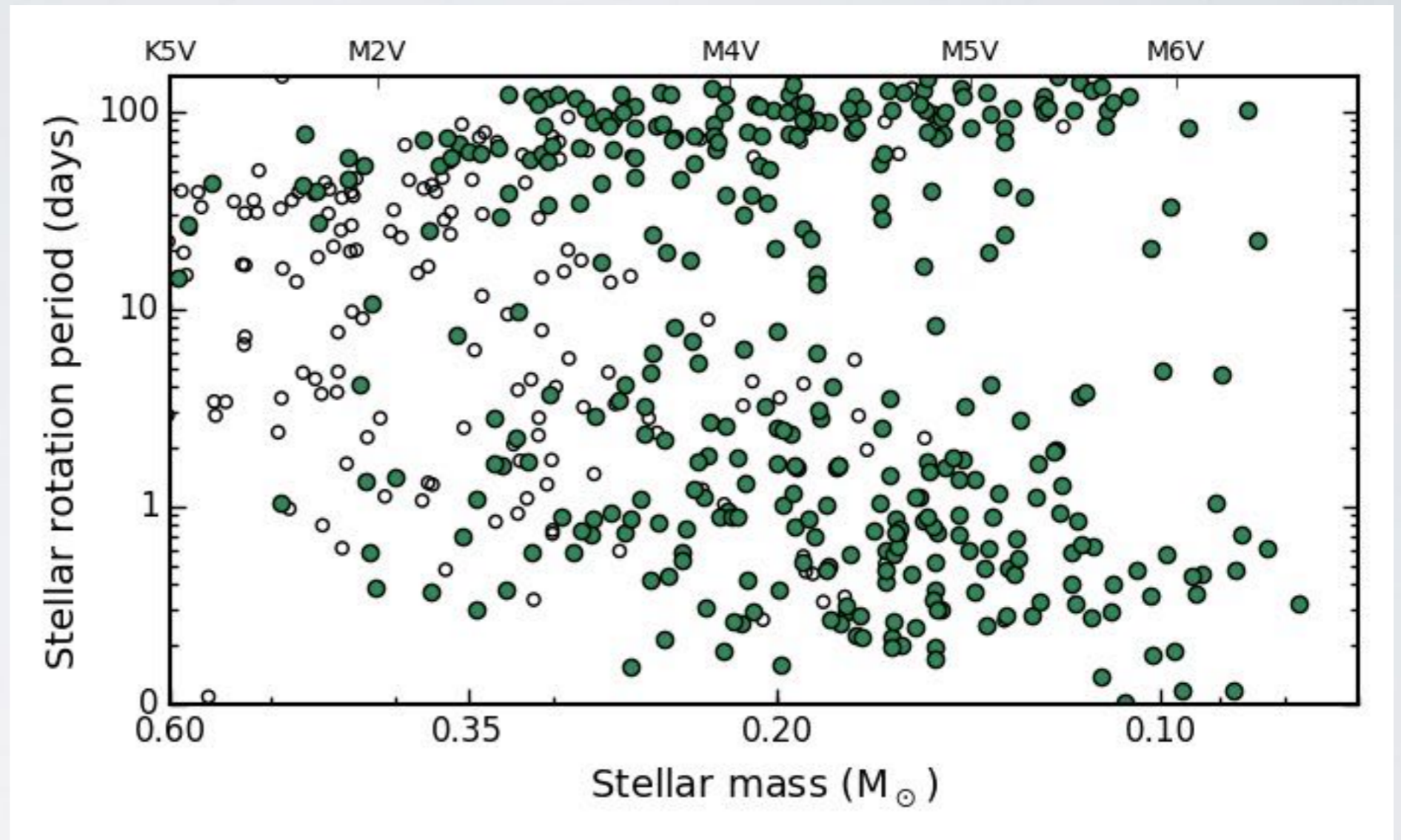
# TI IN M DWARFS



Veyette, Muirhead, Mann et al. (submitted)

# ABUNDANCES: MEASURING M DWARF AGES

MEarth  
rotation  
periods from  
Newton et al.  
(2015)



- With Ti from Veyette (2017), we can determine the **timescale for M dwarf spin flip**



# Dwarf Stars and Clusters with K2: a Workshop



\*January 16-18, 2018\*  
Boston University



# COOL STARS 20



20th Cambridge Workshop on  
Cool Stars, Stellar Systems, and the Sun  
Boston | Cambridge July 29 - August 4, 2018

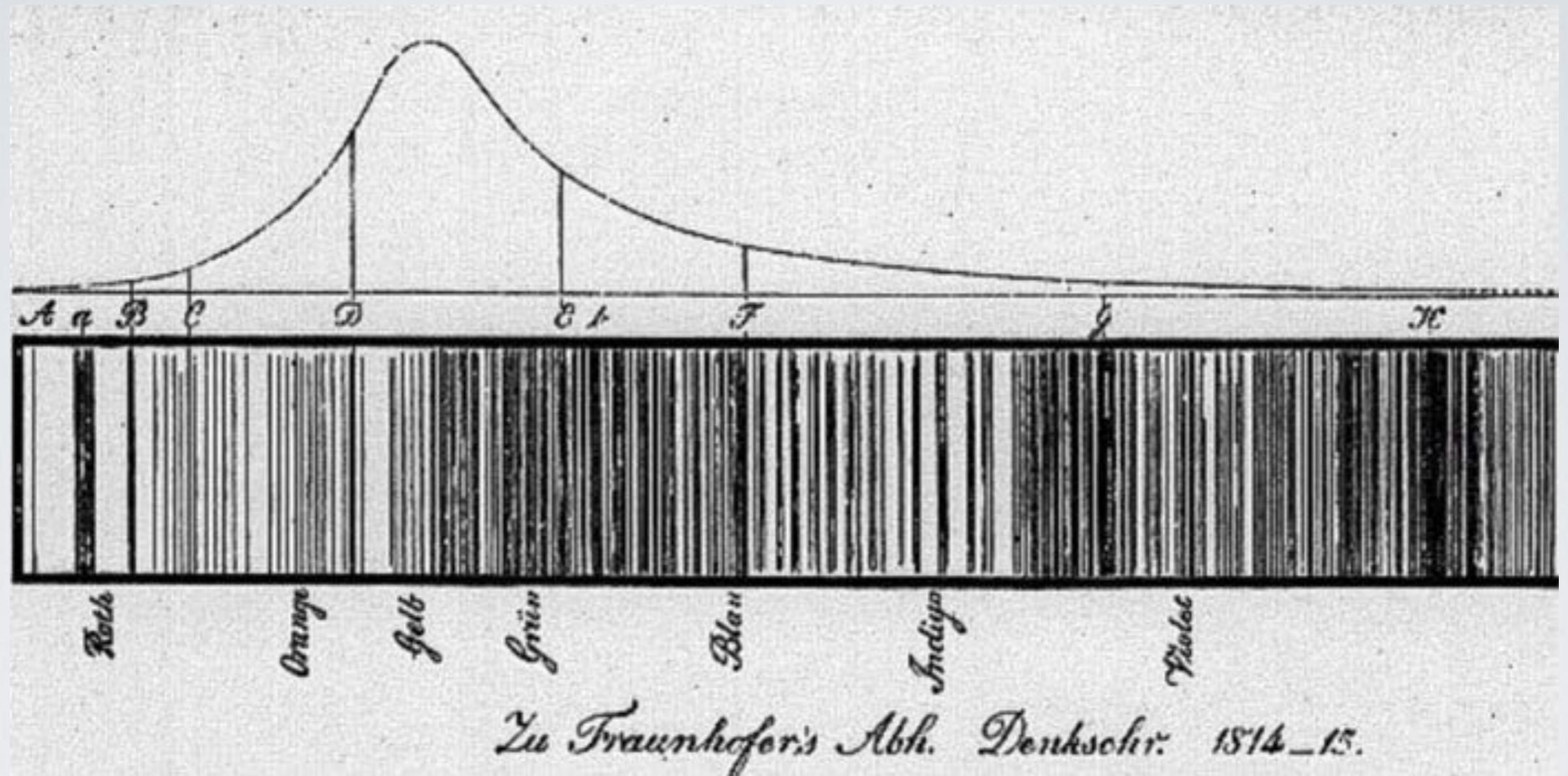


# SOME POINTS TO TAKE HOME

- Spectral type is not useless
- Abundances disentangle overlapping regions on the HR diagram.
- Alpha enhancement (e.g.  $[\text{Ti}/\text{Fe}]$ ) may enable measurements of M dwarf ages.



# SPECTROSCOPY



- Fraunhofer lines (1814): Astronomy becomes Astrophysics