



# Uncovering Binary Formation Channels Using APOGEE

Christine Mazzola Dahir

CCAPP Fellows Symposium  
Sept. 30, 2022

Carles Badenes, Max Moe, Kaitlin Kratter



# Why study binaries?

Because stellar multiplicity affects or is tied to practically every area of astronomy!

Astro2020 Science White Paper

## Stellar multiplicity: an interdisciplinary nexus

*Thematic Areas:*

- |  |   |   |
|--|---|---|
| <input checked="" type="checkbox"/> Formation and Evolution of Compact Objects | <input checked="" type="checkbox"/> Planetary Systems                                   | <input checked="" type="checkbox"/> Star and Planet Formation         |
| <input checked="" type="checkbox"/> Stars and Stellar Evolution                | <input checked="" type="checkbox"/> Resolved Stellar Populations and their Environments | <input checked="" type="checkbox"/> Cosmology and Fundamental Physics |
| <input checked="" type="checkbox"/> Galaxy Evolution                           | <input checked="" type="checkbox"/> Multi-Messenger Astronomy and Astrophysics          |   |

*Principal Authors:*

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Institution: Canadian Institute for Theoretical Astrophysics

Email: kbreivik@cita.utoronto.ca

Name: **Adrian M. Price-Whelan**

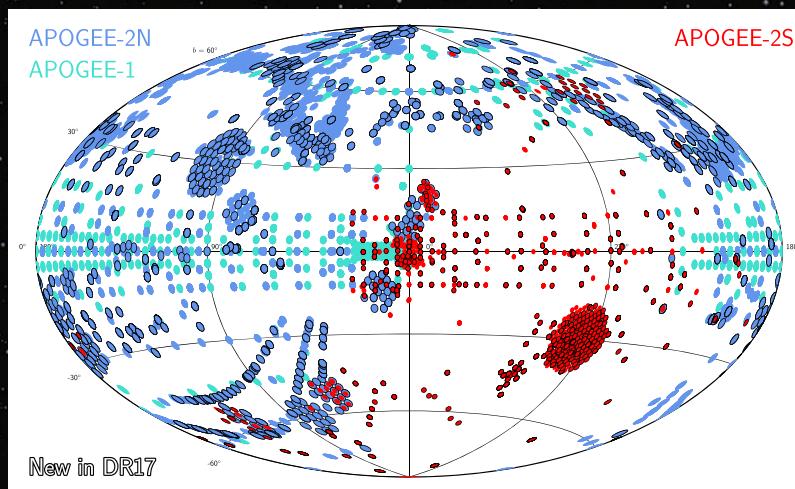
Institution: Princeton University

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# SDSS-IV: APOGEE-2 - Overview

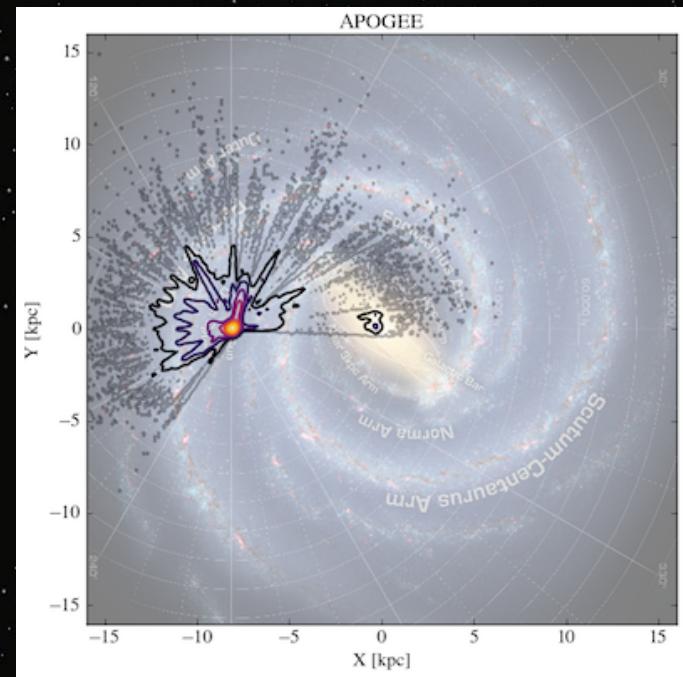
- Infrared: H band accesses all major populations of the Milky Way
- High-resolution spectra:  $R \sim 22,500$
- Public: well-documented and available for all!
- Multi-epoch: signs of unseen companions?



SDSS DR17 Release Paper (*Abdurro'uf+2022*)

Sept. 30, 2022

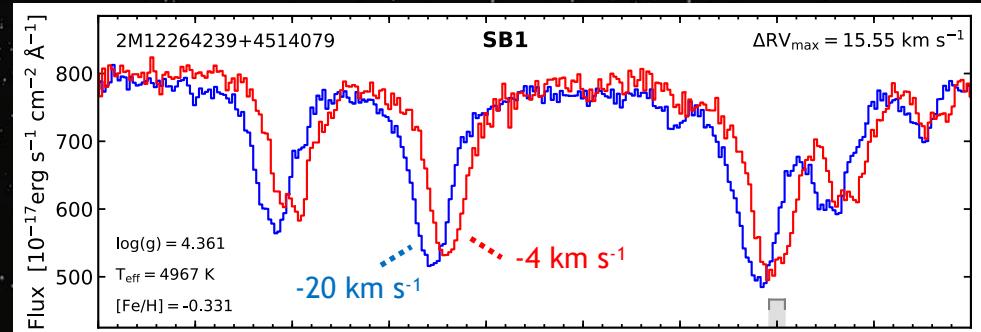
CMD – CCAPP Symposium



# SDSS-IV: APOGEE-2 - *Spectra*

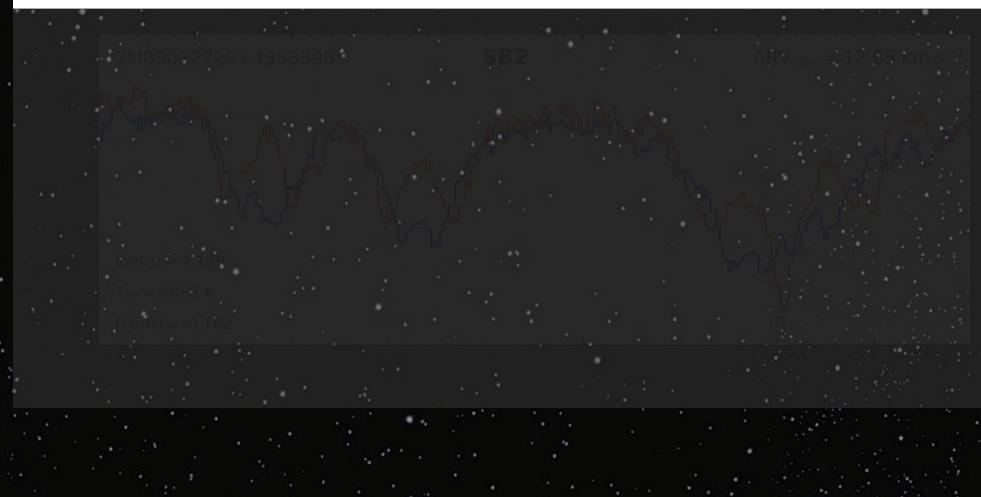
## Spectroscopic Binary 1 (SB1)

- Only see clear spectral features from the photometric primary
- Lines Doppler shifted periodically due to orbital motion
- Convert those shifts into radial velocities (RVs)



## Spectroscopic Binary 2 (SB2)

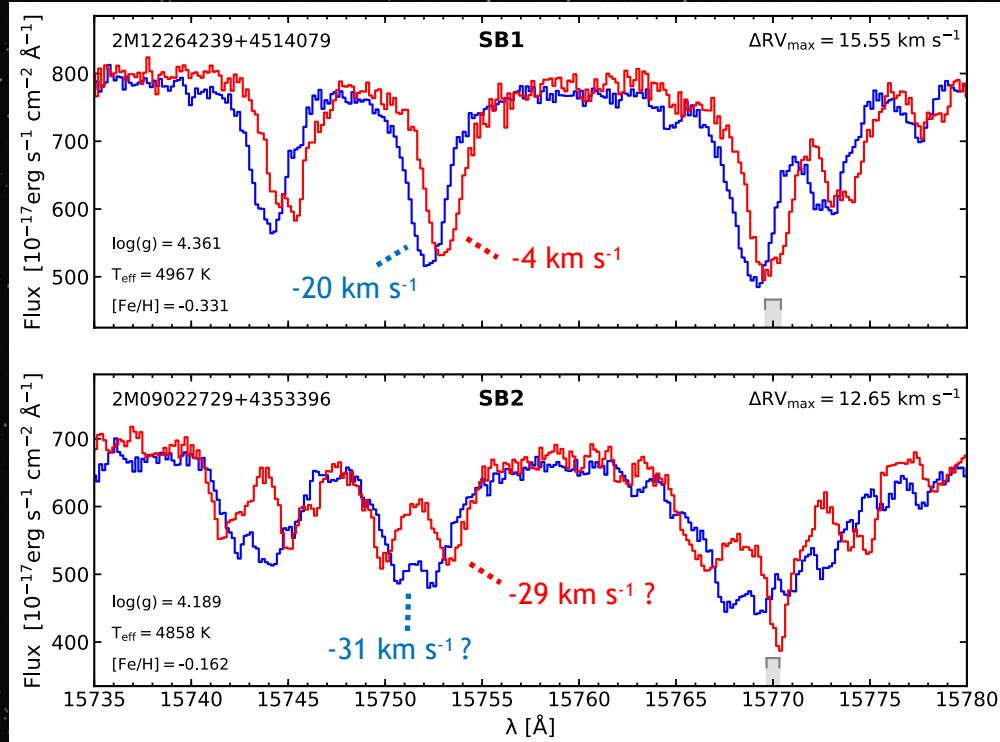
- See clear spectral features from both primary and secondary
- Line blending and inconsistent RV determination can confound the APOGEE pipeline



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# RV Curves - Theory

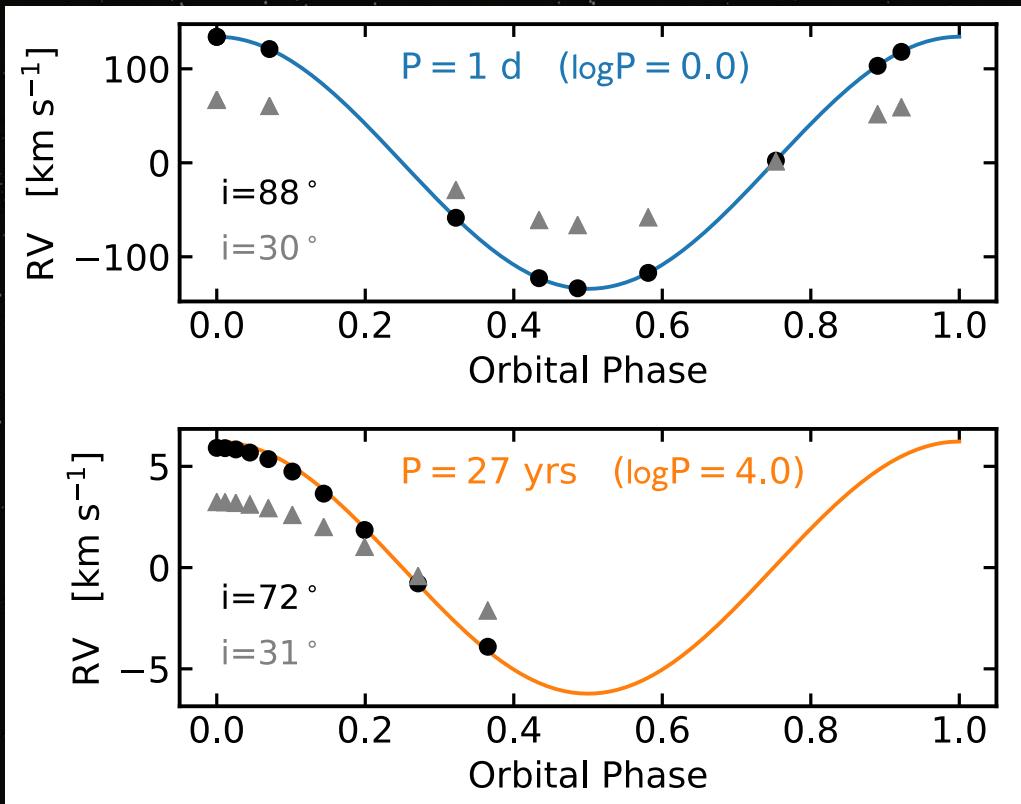
$$RV_1(t) = K \sin i (\cos(\nu(t) + \omega) + e \cos \omega)$$

- $K$  : semi-amplitude
- $i$  : inclination
- $e$  : eccentricity

Maximum possible RV shift =  $2K$

$$K = \frac{2\pi}{\sqrt{1-e^2}} \frac{a}{P} \frac{q}{1+q}$$

- $P$  : period
- $q$  : mass ratio,  $m_2/m_1$
- $a$  : orbital separation



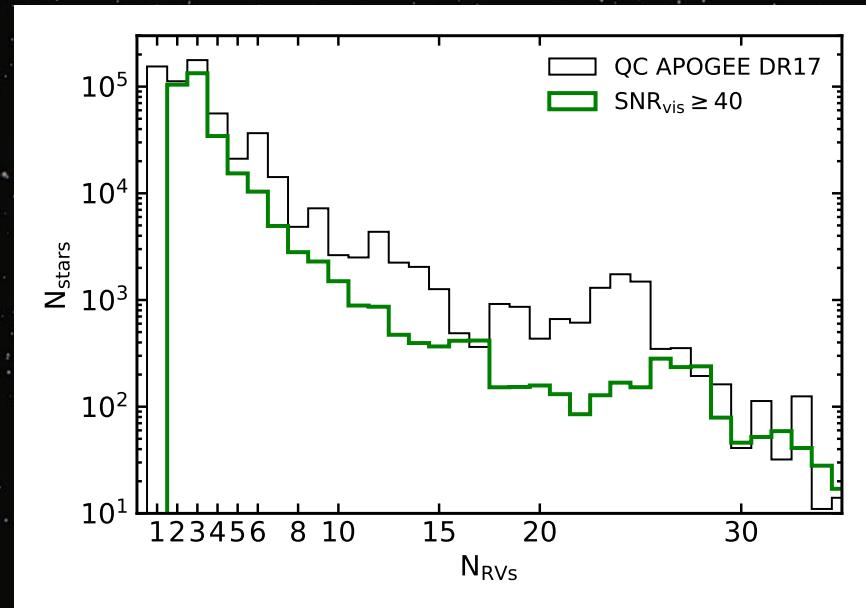
# RV Curves - Sparsely-Sampled + $\Delta RV_{max}$

## Problem: Survey Planning

Getting spectra for hundreds of thousands of stars means you can't get targeted RVs for most of them.

## Problem: It's Complicated...

Multiplicity statistics are strong functions of the intrinsic and evolutionary properties of stars...and they are not independent of each other.



To constrain multiplicity in a complex multivariate space of stellar properties, we need large samples of well-measured stars.

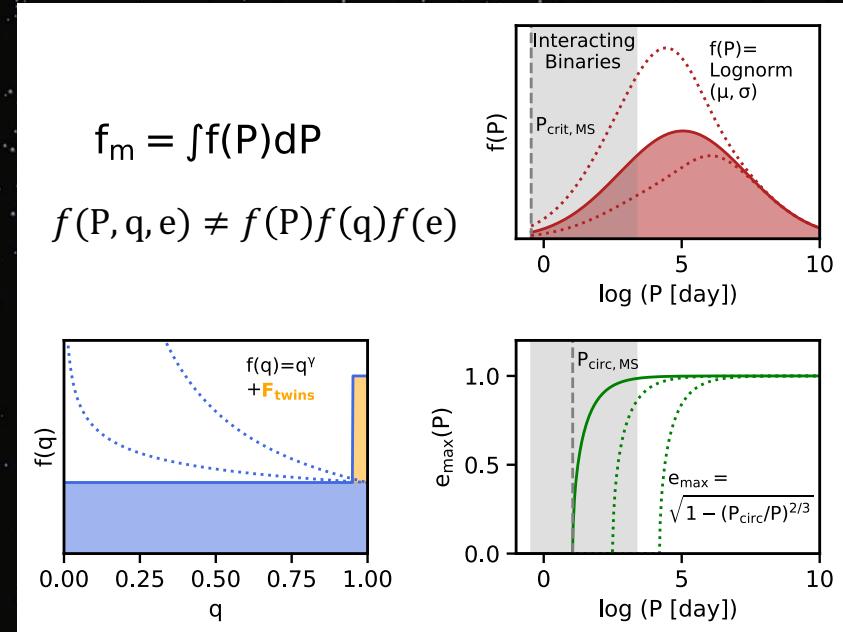
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NSF Grant AST-1909022

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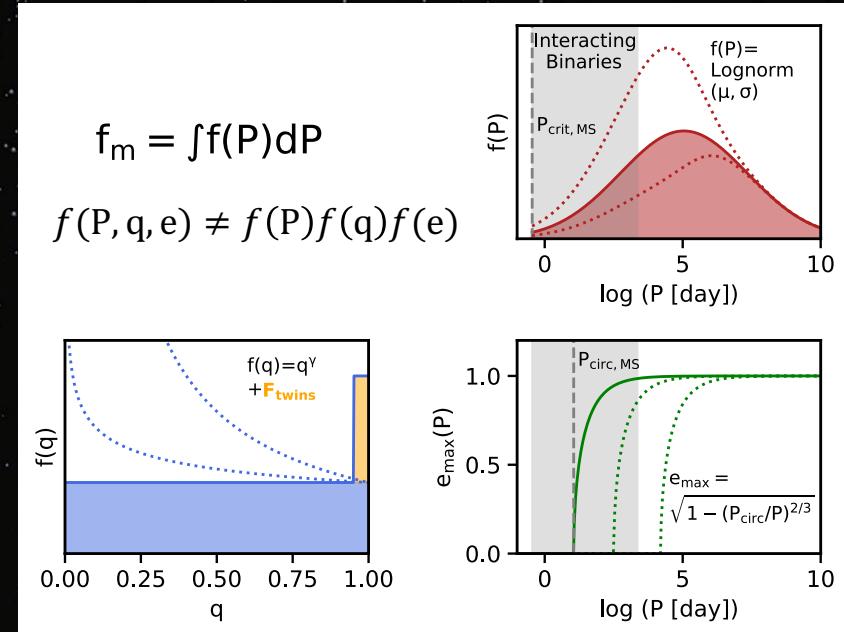
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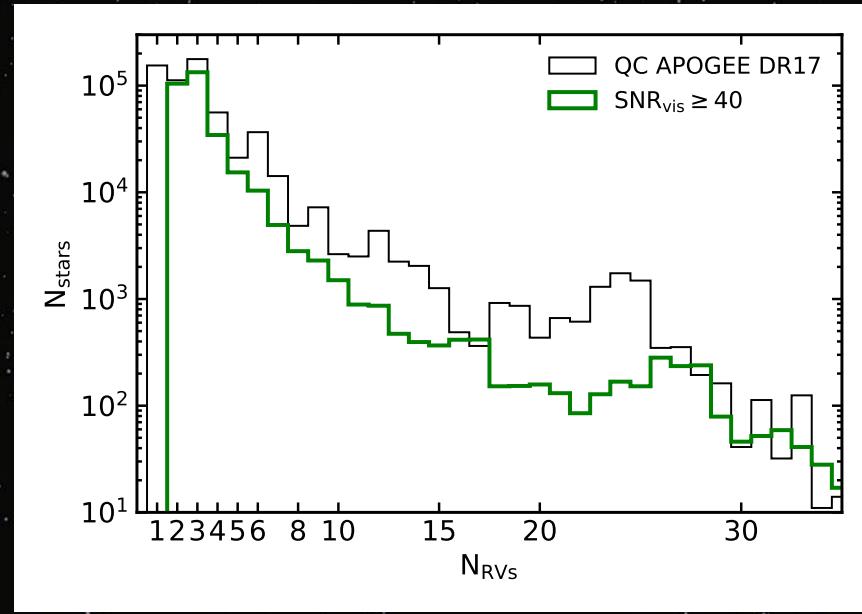
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# RV Curves - *Sparsely-Sampled* + $\Delta RV_{max}$

**Our Solution:** Don't fit RV curves – just use the data you have!

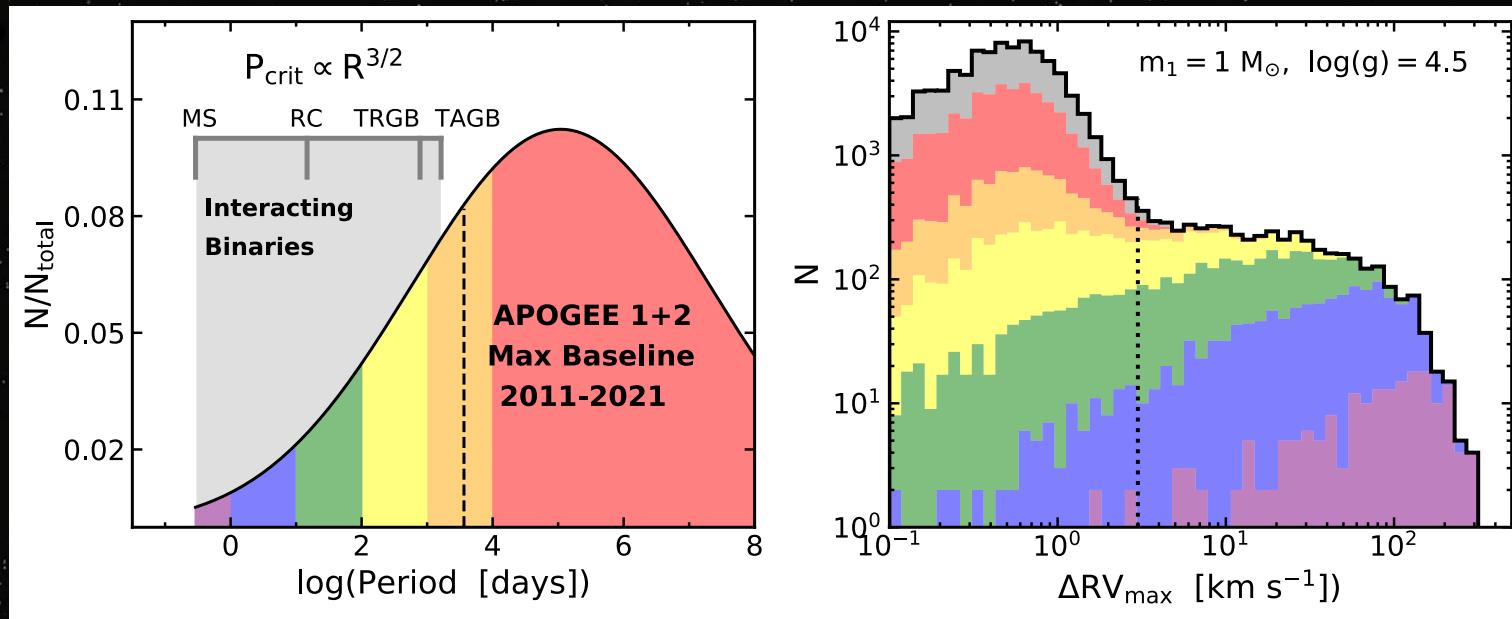
$$\Delta RV_{max} = |RV_{max} - RV_{min}|$$



$$f_{RVvar} = \frac{N_{\Delta RV_{max} \geq X \text{ km s}^{-1}}}{N_{total}}$$

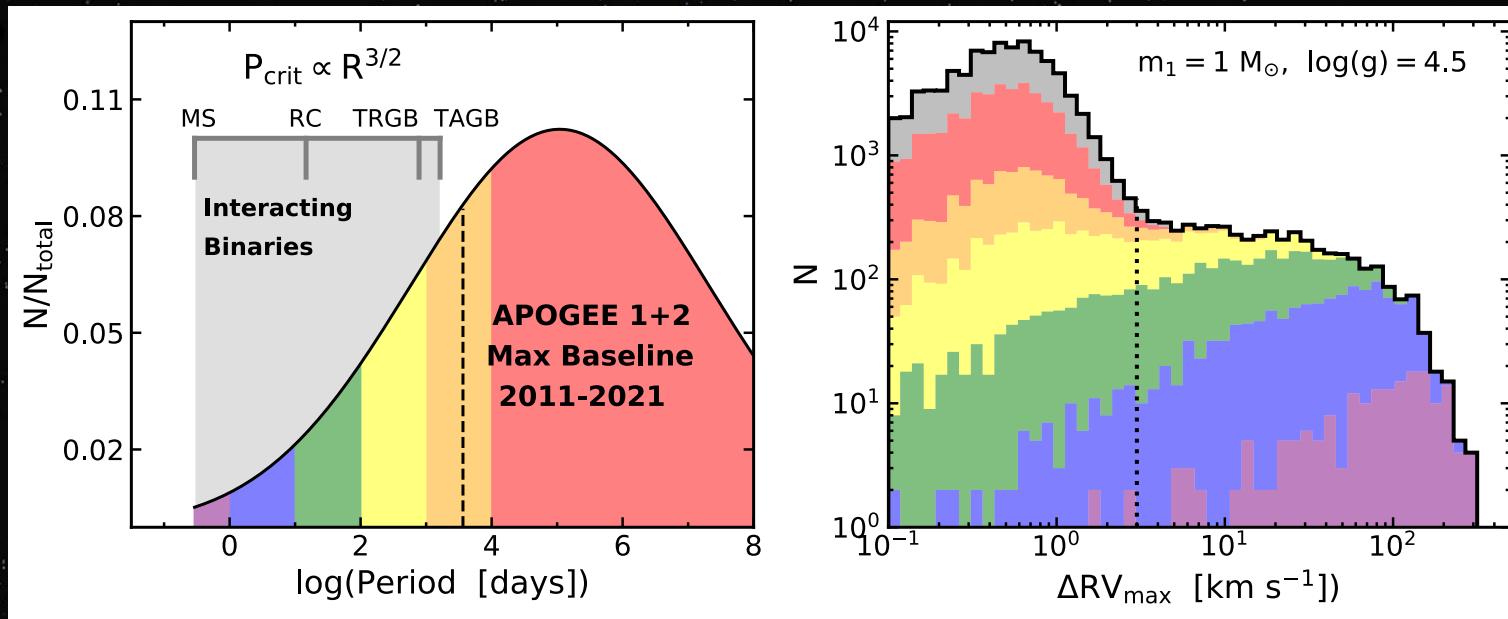
$$\sigma_{f_{RVvar}} = \sqrt{\frac{f_{RVvar} (1 - f_{RVvar})}{N_{total}}}$$

# RV Curves - Sparsely-Sampled + $\Delta RV_{max}$



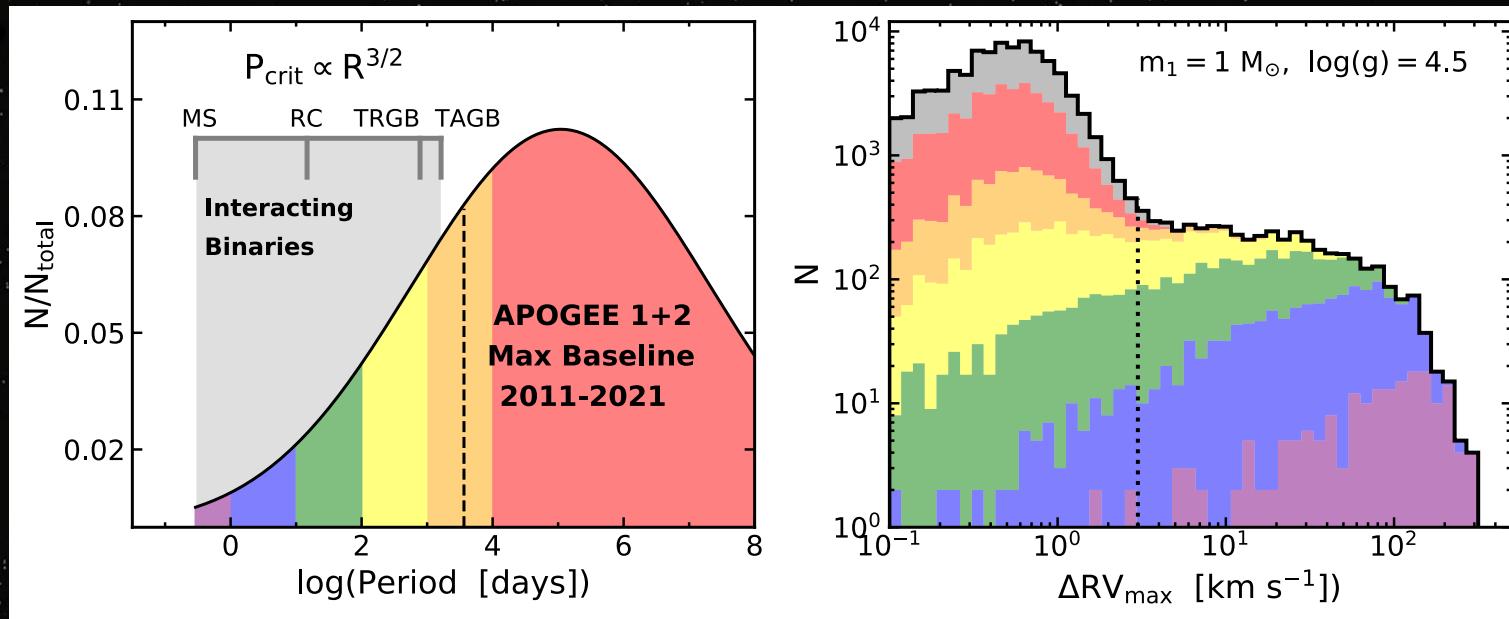
- Low  $\Delta RV_{max}$  “core” dominated by single stars (gray) + long-period binaries
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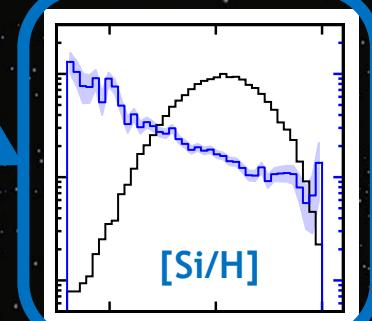
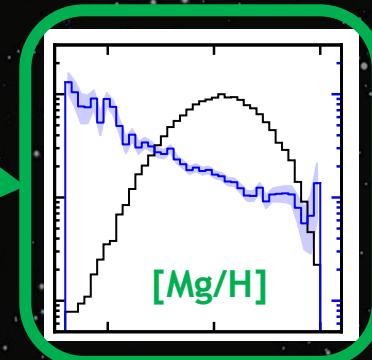
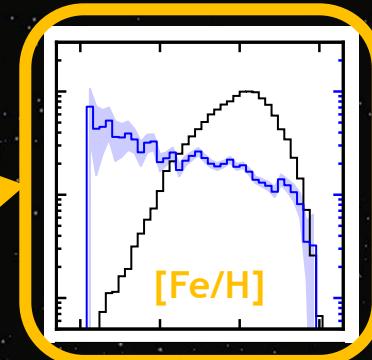
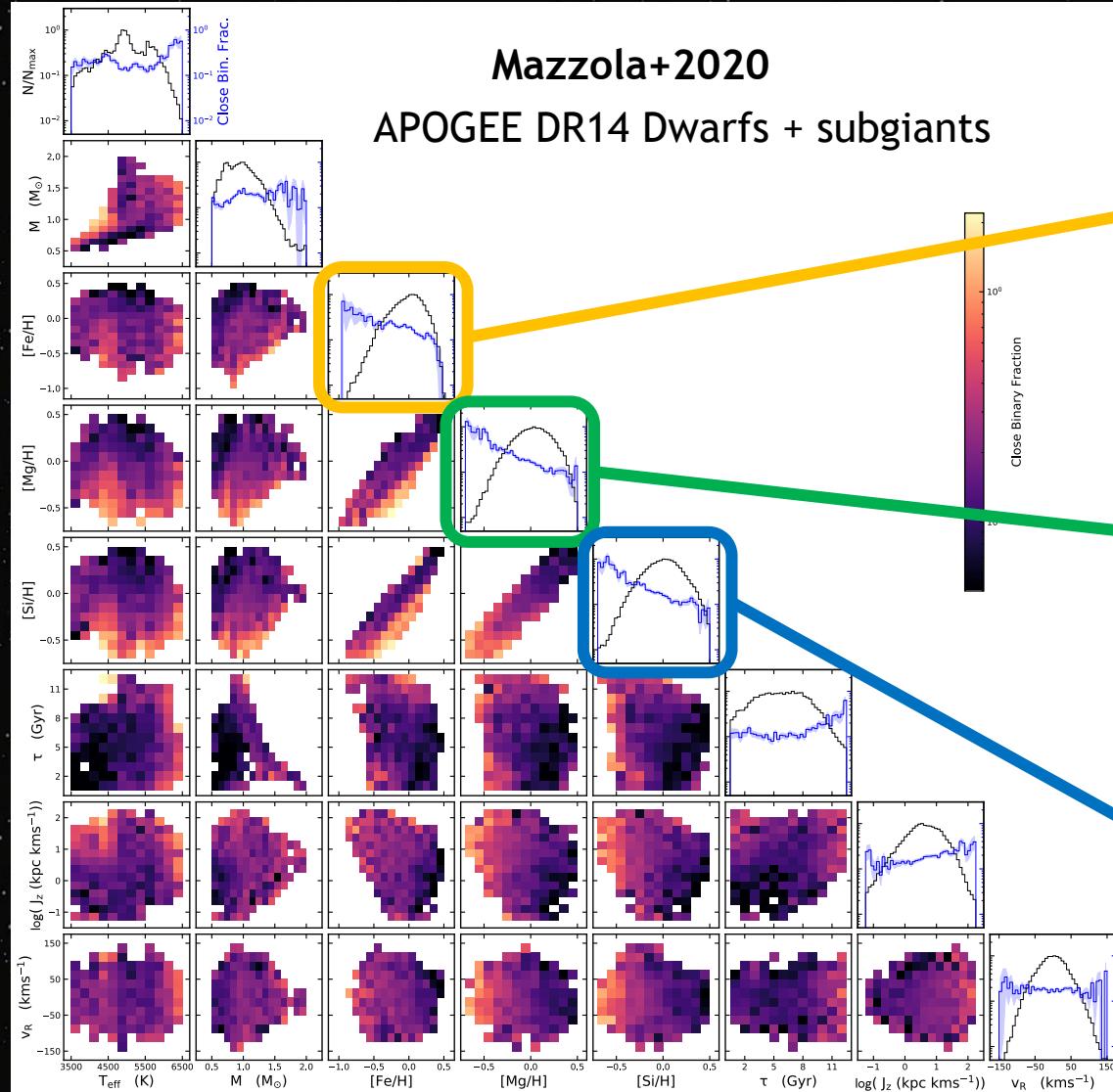
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# Mazzola+2020

APOGEE DR14 Dwarfs + subgiants

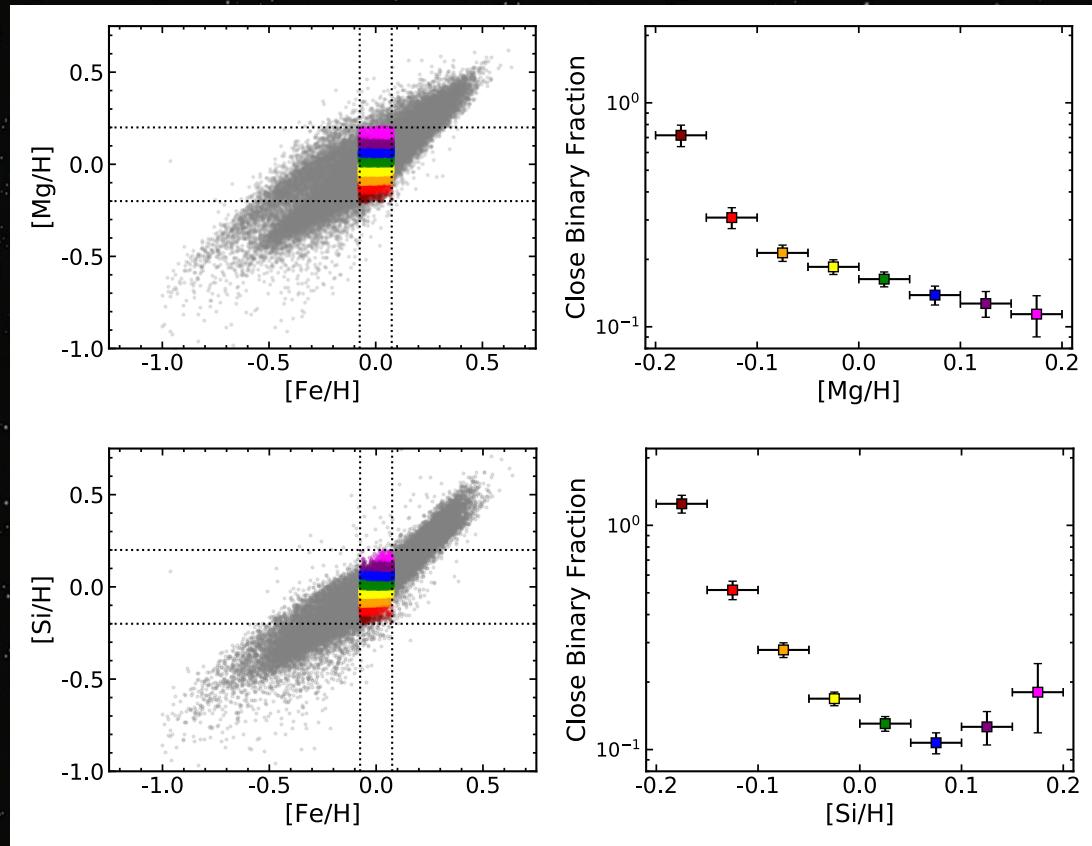


# CBF and Chemistry - *Results*

Stronger anti-correlation  
between CBF and  $\alpha$   
than with Fe,

but...

Strongly non-monotonic  
at solar [Fe/H]!



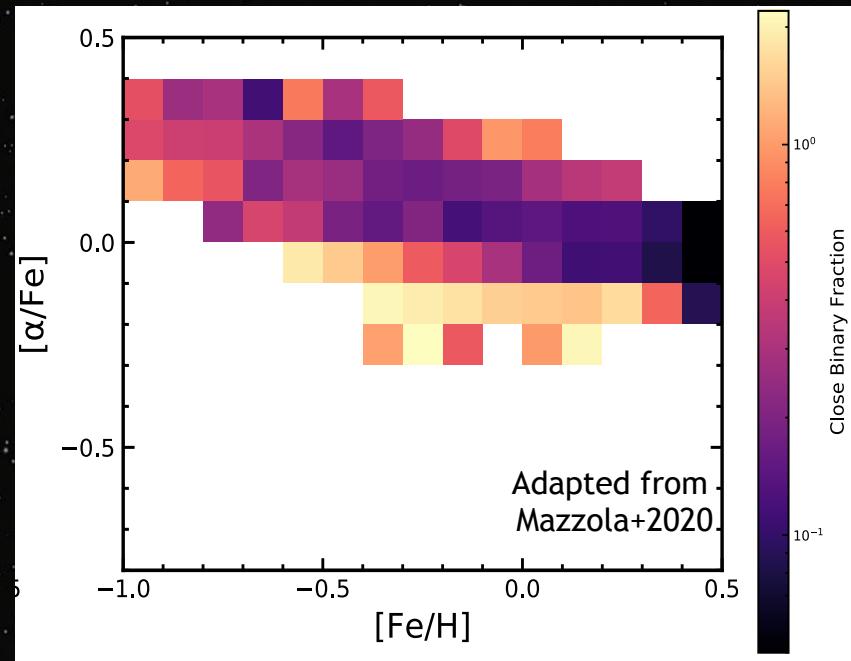
Adapted from Mazzola+2020

# CBF and Chemistry - *Interpretation*

Models predict an anti-correlation between [Fe/H] and protostellar disk fragmentation.

- Metal-poor cores are hotter, larger, and more gravitationally unstable.
- Metal-poor disks have lower optical depths, promoting cooling and fragmentation.

***So what about  $\alpha$  abundances?***



For  $[\alpha/\text{Fe}] < 0.05$ , these effects produce an even stronger anti-correlation with  $\alpha$  abundance than with Fe!

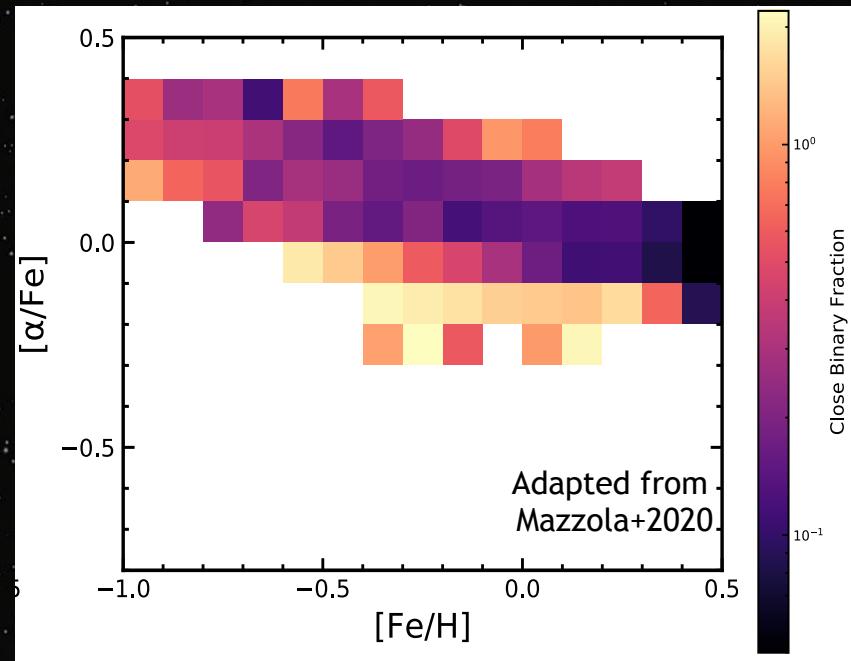
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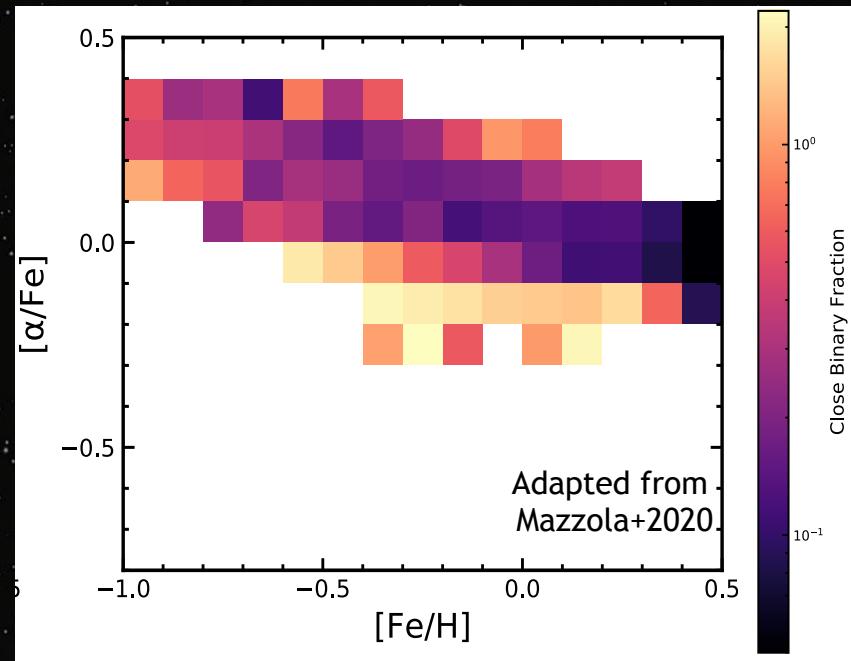
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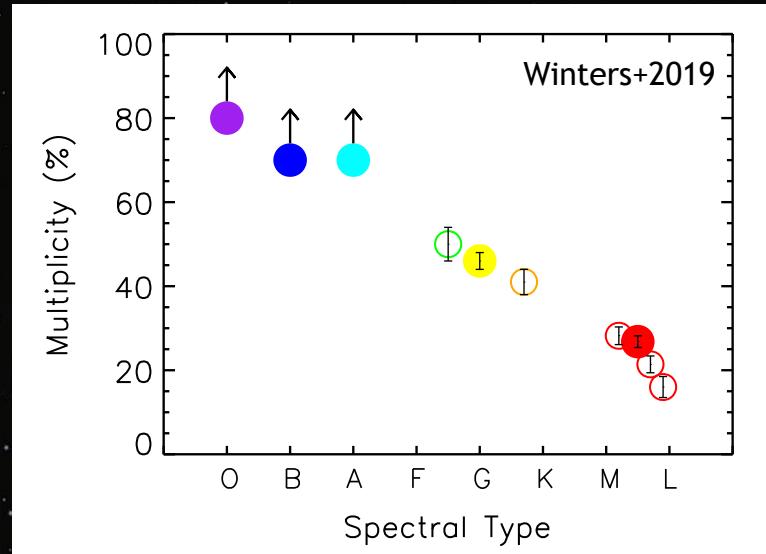
# CBF and M dwarfs - Motivation

A floor of CBF  $\sim 10\%$  has emerged elsewhere too—M/brown dwarfs!

Perhaps this floor is universal. But *why*?

Two leading explanations:

- 1) At least 10% of protostellar discs fragment early on, regardless of their chemistry or final mass.
- 2) Metal-rich and/or low-mass discs can't fragment, *but* a small fraction of cores fragment on larger scales and decay into closer binaries, leading to CBF  $\sim 10\%$ .



How the M-dwarf CBF varies with chemistry can distinguish between these two possibilities.

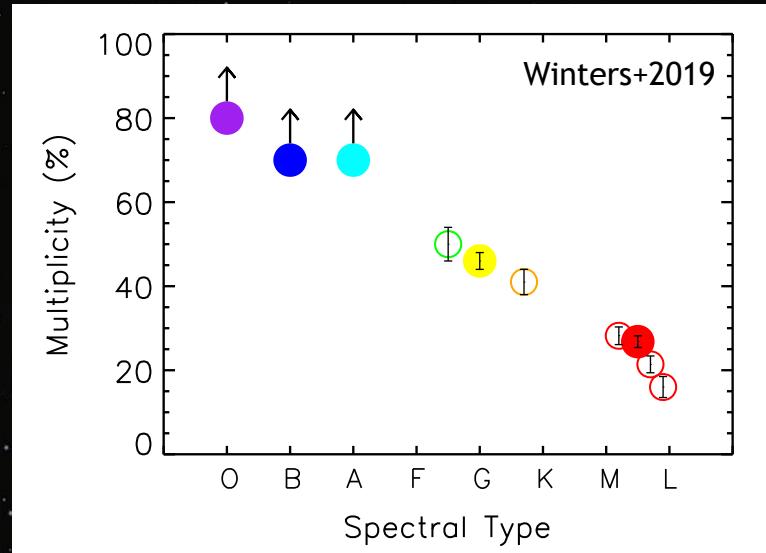
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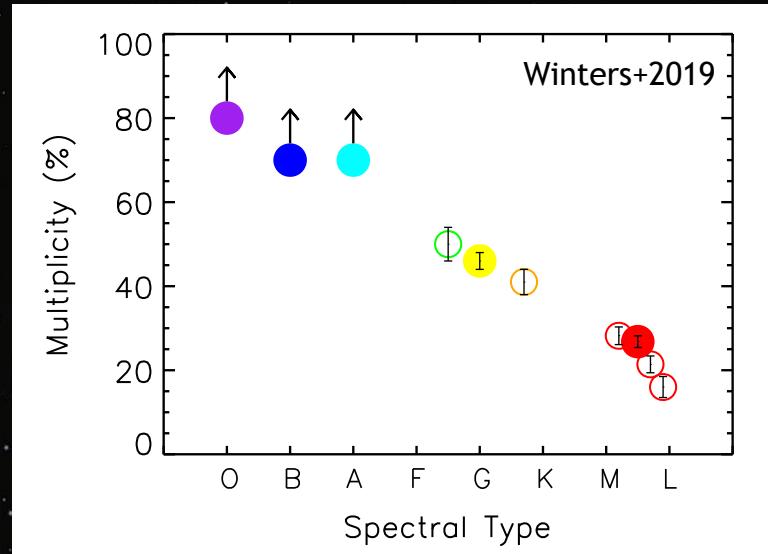
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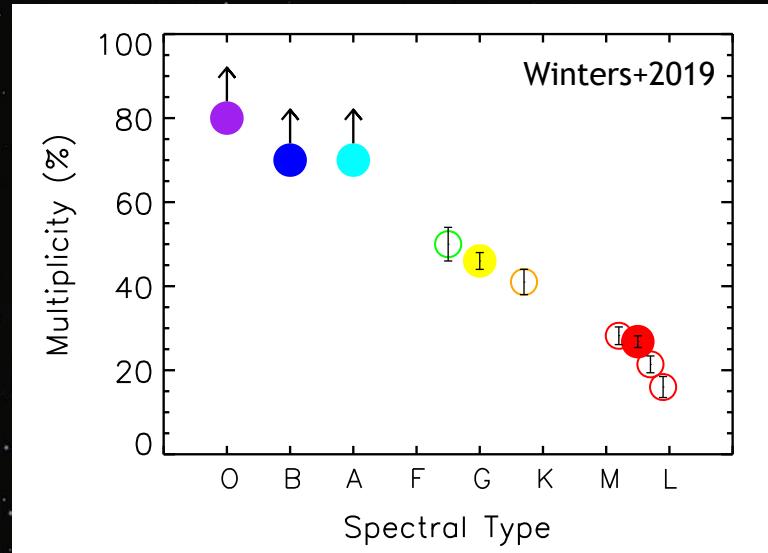
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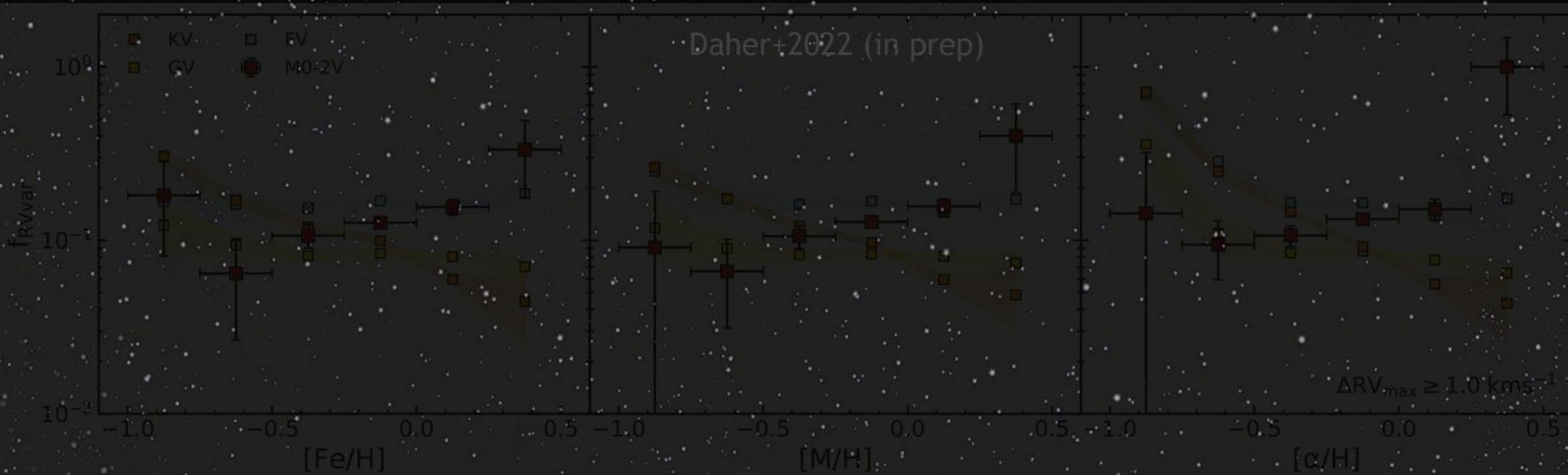


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# CBF and M dwarfs - Preliminary Data

- APOGEE DR17 RVs,  $T_{\text{eff}}$ ,  $\log(g)$ , chemical abundances
- Gaia EDR3 Bailer-Jones distances
- HR-select dwarfs,  $T_{\text{eff}}$ -assign M K G F

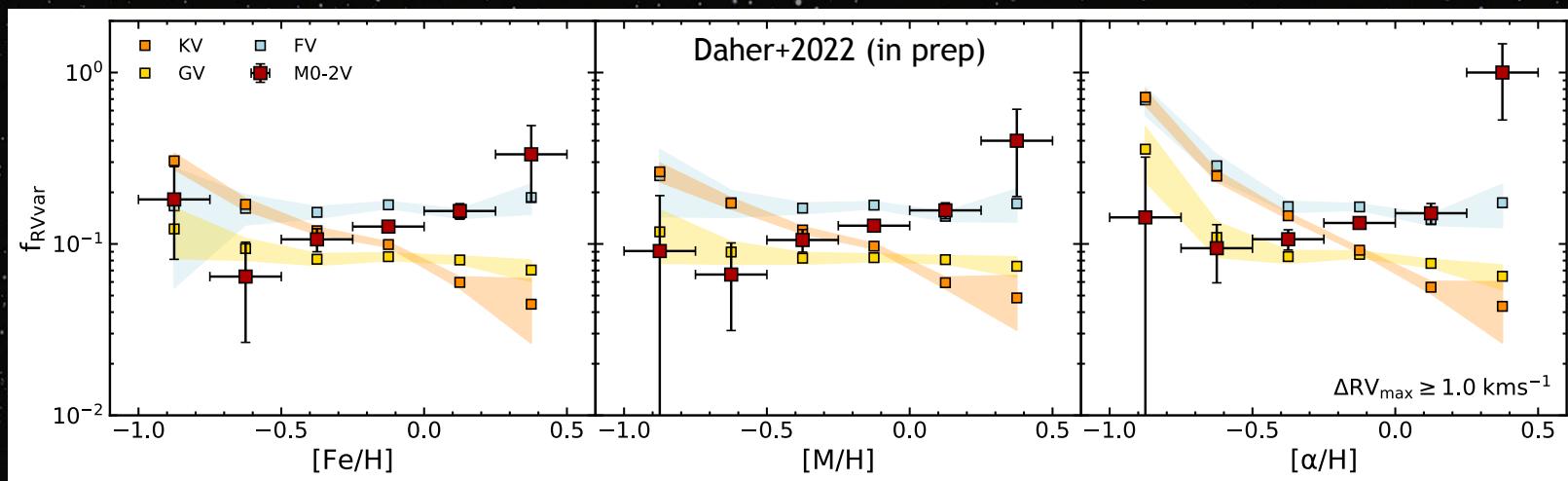
Spectral Type	$T_{\text{eff}}$ Range	$\log(g)$ Range	N	
			N	$N_{\text{RVvar}}$
F	5960 – 7220	3.39 – 4.69	8125	1304
G	5325 – 5960	3.56 – 5.39	21776	2050
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M0-5	3000 – 3890	4.36 – 6.10	4127	492



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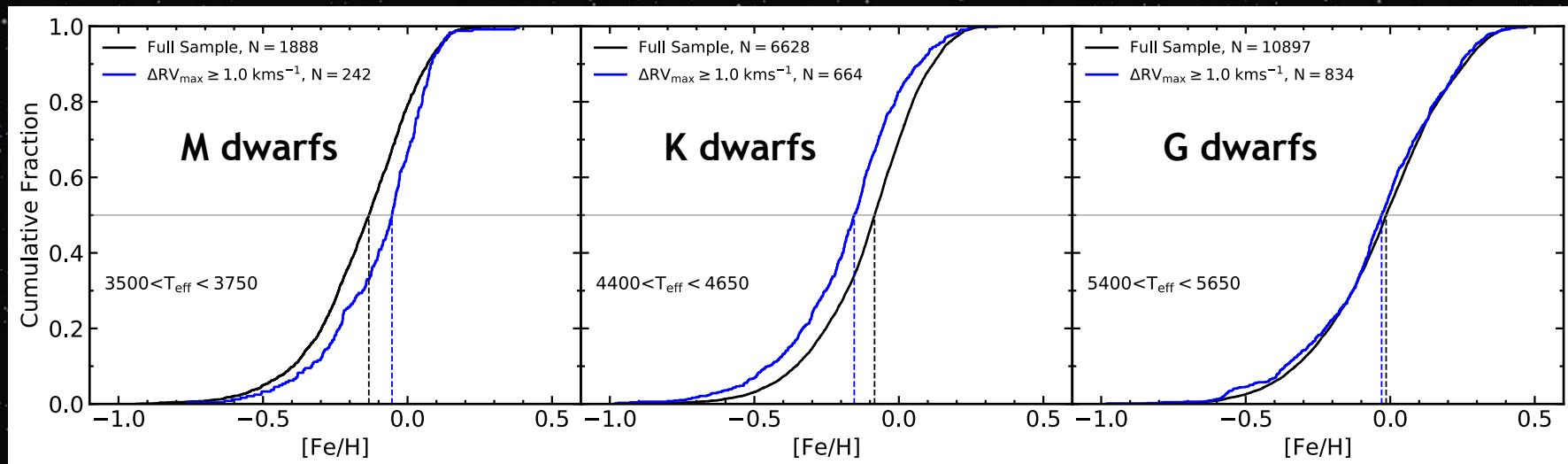
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# CBF and M dwarfs - *Preliminary Results*

Compare the cumulative distributions of [Fe/H] for RV variables vs. the full population of M vs. K vs. G dwarfs.



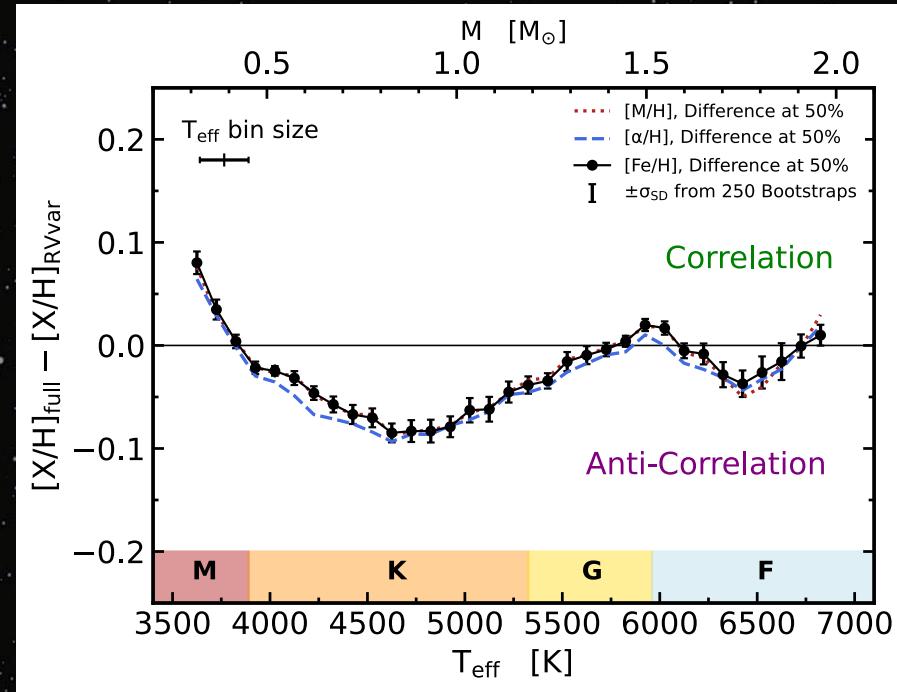
Daher+2022 (in prep)

# CBF and M dwarfs - *Preliminary Results*

Shift the  $T_{\text{eff}}$  bin center slowly and measure the difference between the cumulative histograms each time.

- Transition seems to occur around  $T_{\text{eff}} \sim 3800$  K ( $0.45 M_{\odot}$ )
- The differences reach an inflection point around  $4750$  K ( $0.8 M_{\odot}$ )
- For G/F, the difference flattens out and gets noisy

No matter the bin width or shift, and for all  $\Delta RV_{\text{max}}$  thresholds of 1,2,3,10



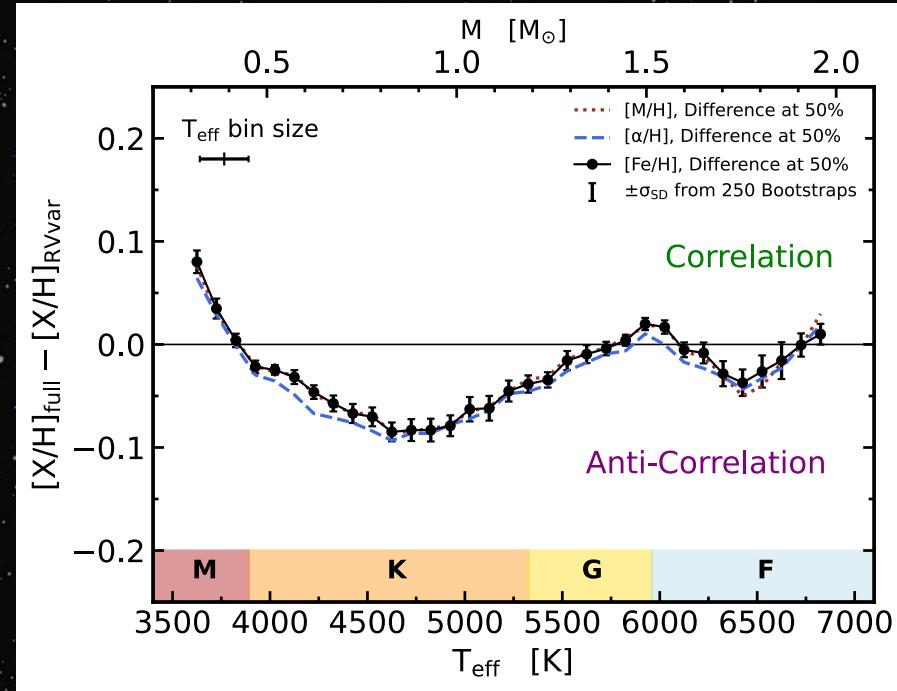
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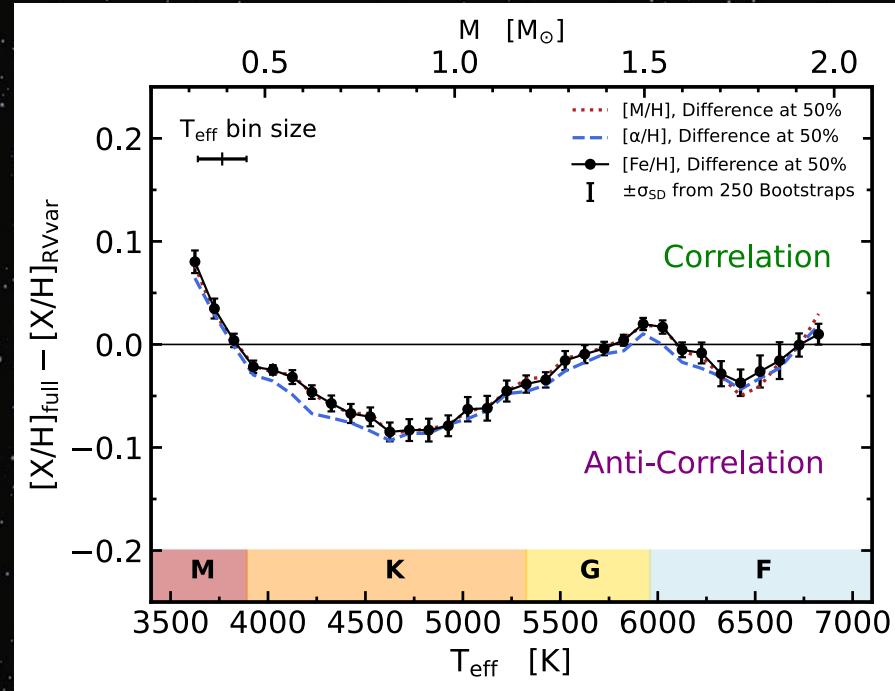
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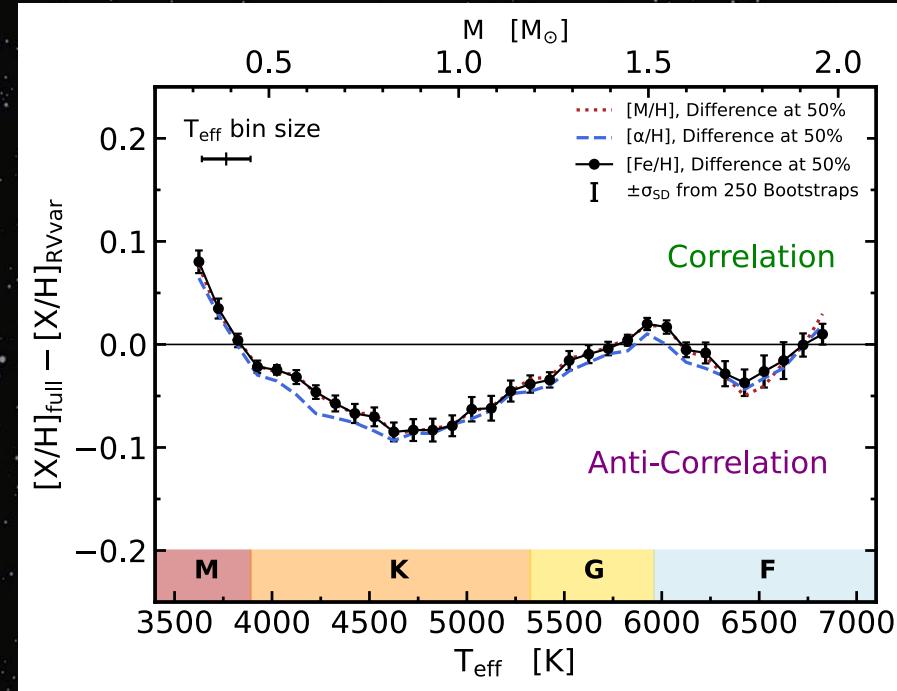


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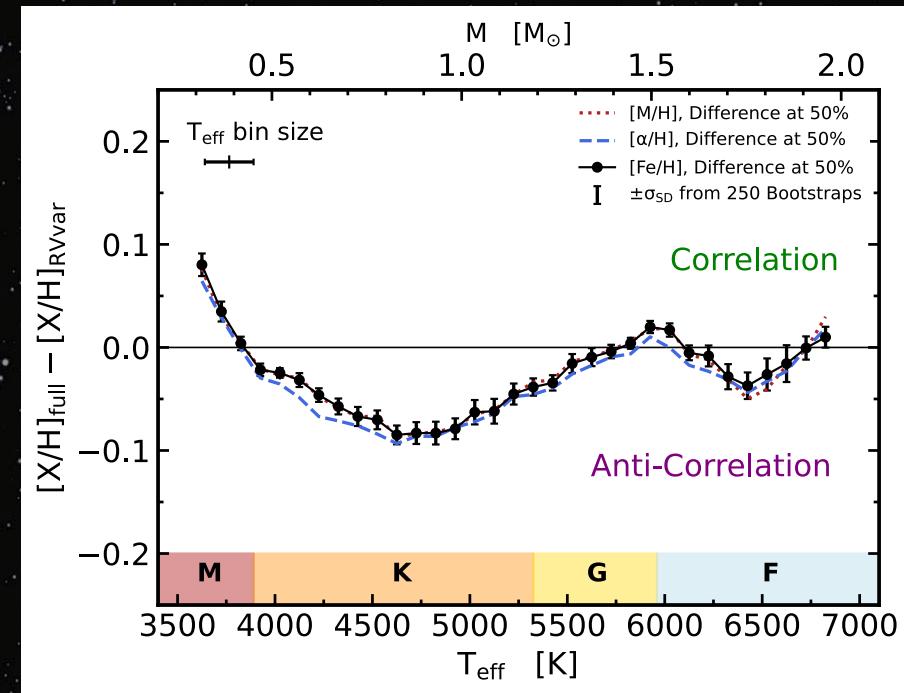
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# CBF and M dwarfs - *Preliminary Interp.*

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Inflection at  $0.8 M_{\odot}$  is curious – theory + past data say this is where a positive correlation with  $M$  should begin.



Maybe a slow hand-off between metallicity-driven fragmentation and mass-driven fragmentation?

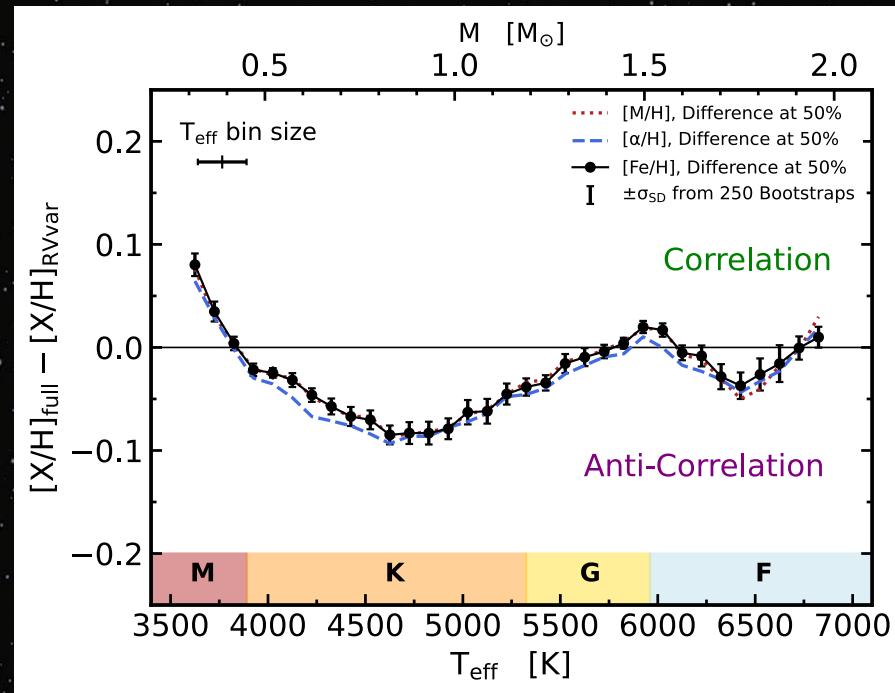
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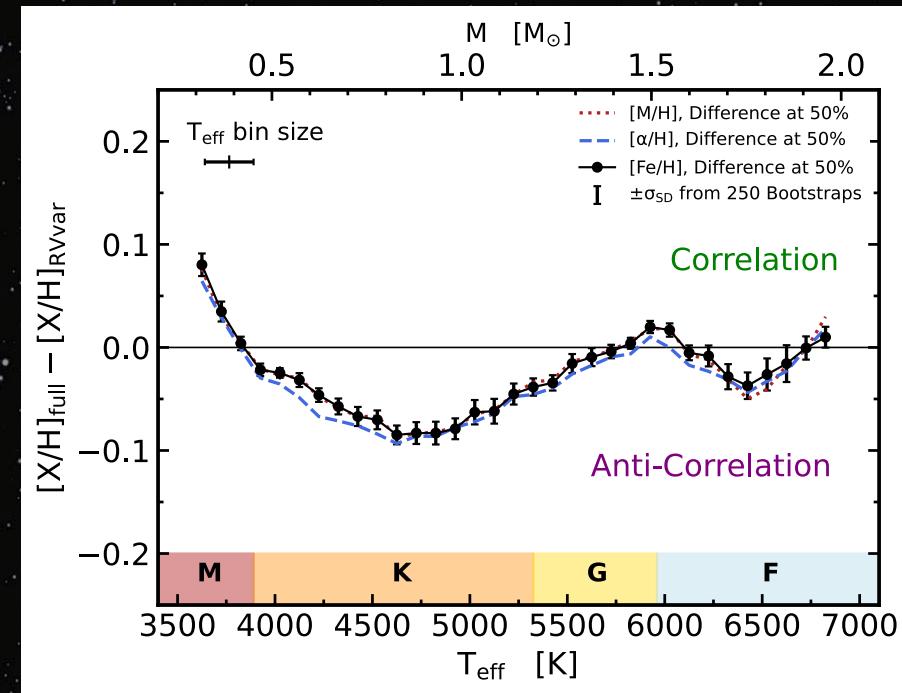


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# Summary

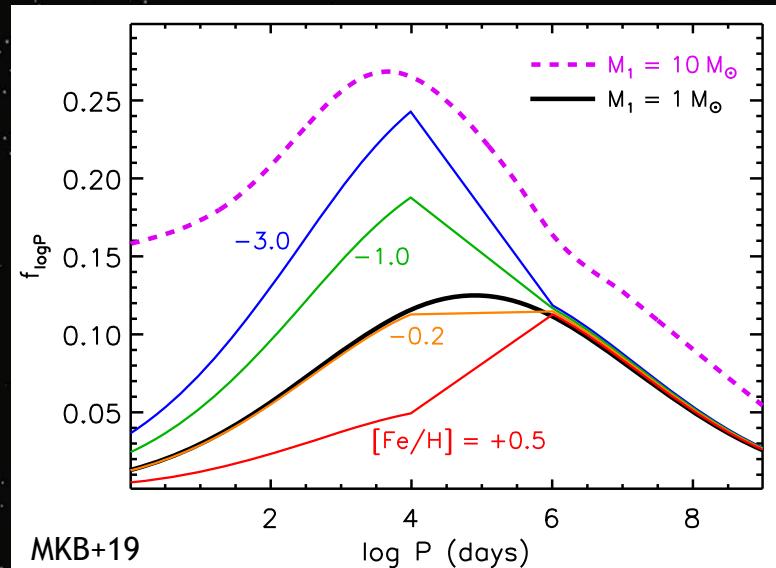
- Binaries are fundamental to our understanding of astrophysics
- Large samples of binaries are needed to disentangle various correlations from one another
- Chemistry + CBF = clues to the formation of close binaries

MKB+19

# Future Work - Bayesian Inference + $P_{orb}$

Another consequence of these theories is that companions should be skewed towards shorter periods.

This leads to an increase in high- $\Delta RV_{max}$  stars, which to our method is degenerate with an increased close binary fraction.



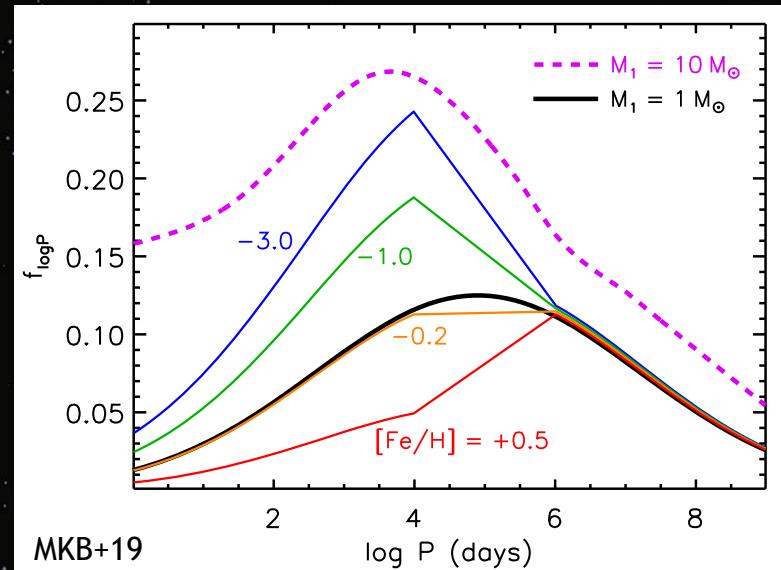
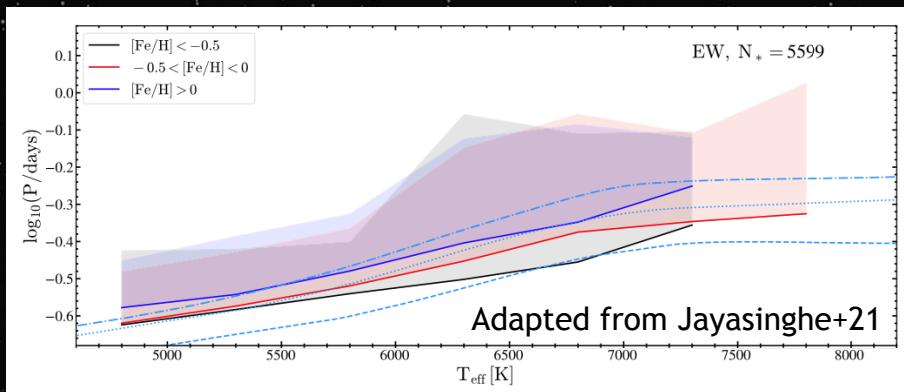
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Adapted from Jayasinghe+21

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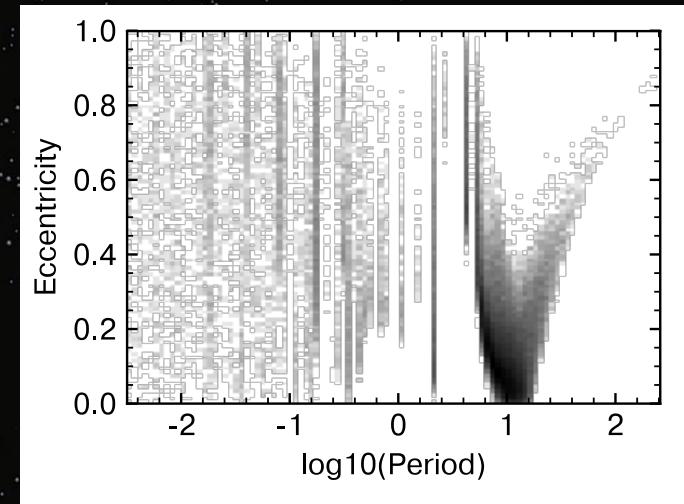
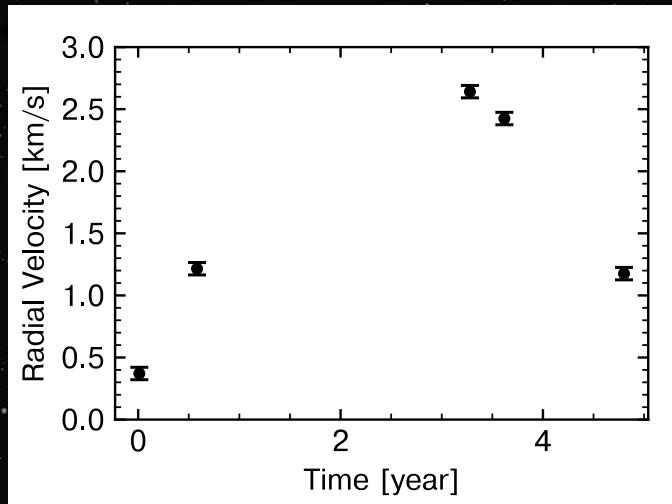
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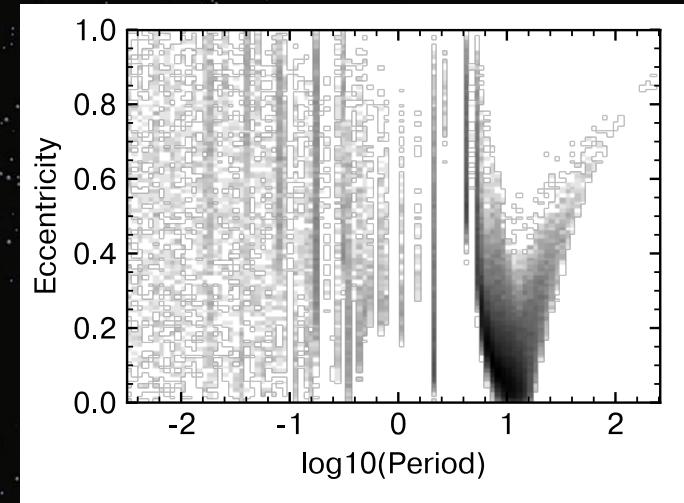
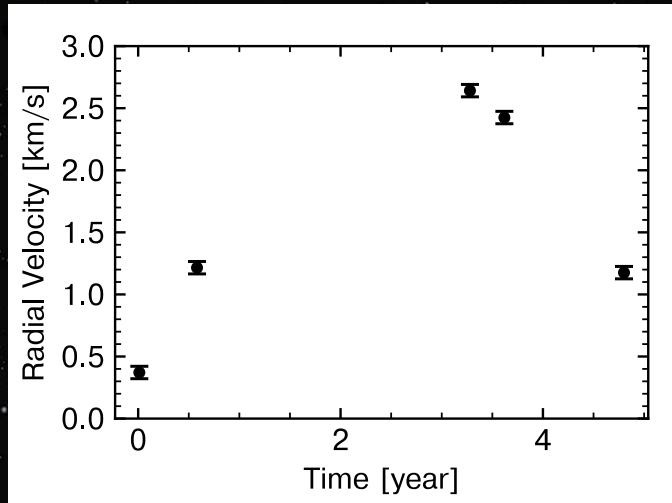


NSF Grant AST-1909022

It may be impossible to tightly constrain a given binary's  $P_{\text{orb}}$  with 2-3 RVs...

But we can constrain  $P_{\text{orb}}$  as a function of Fe and  $\alpha$  abundances using the weak constraints of 100,000s of APOGEE/MWM stars!

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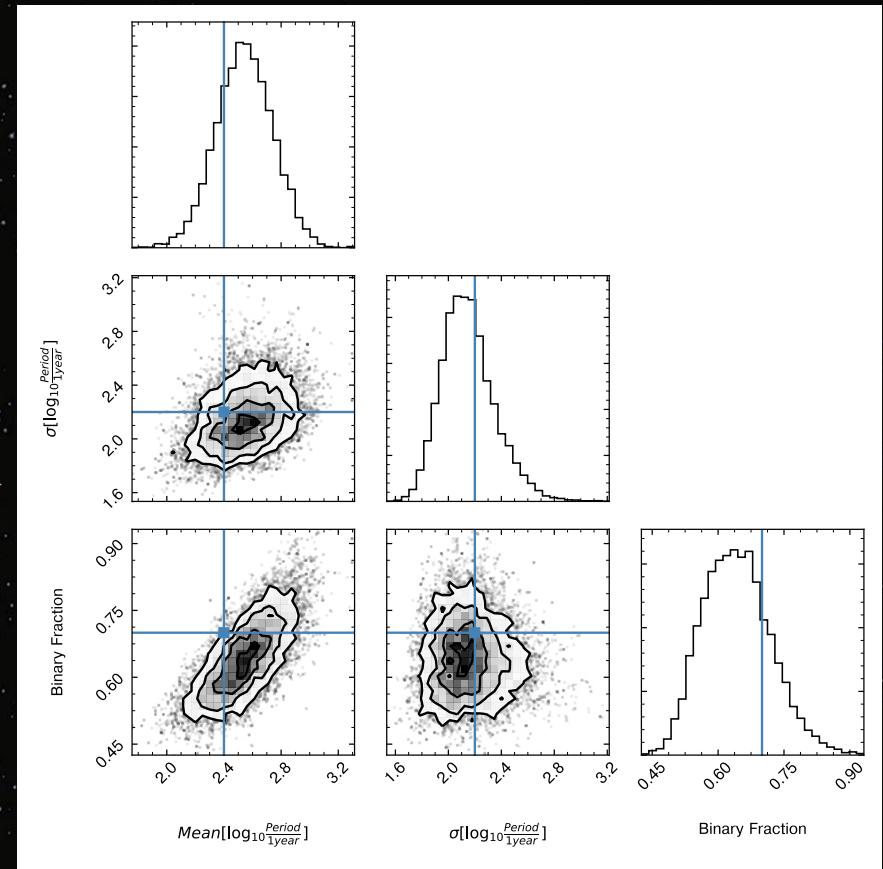
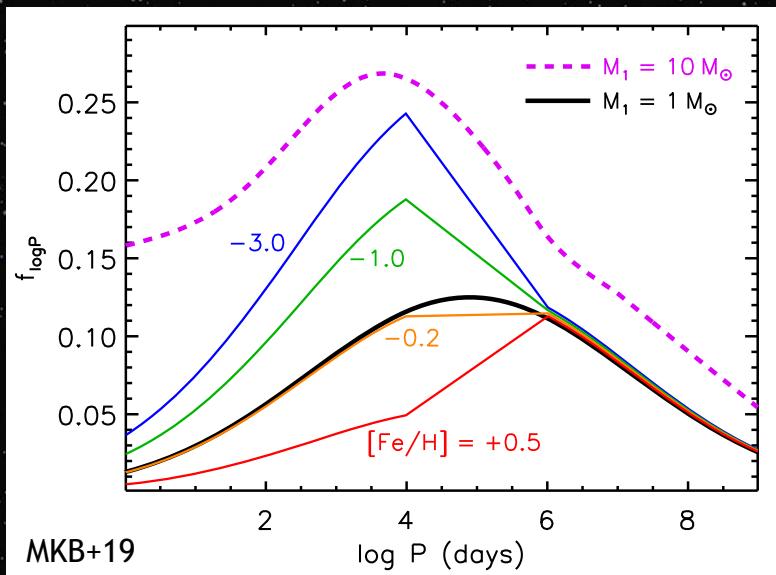


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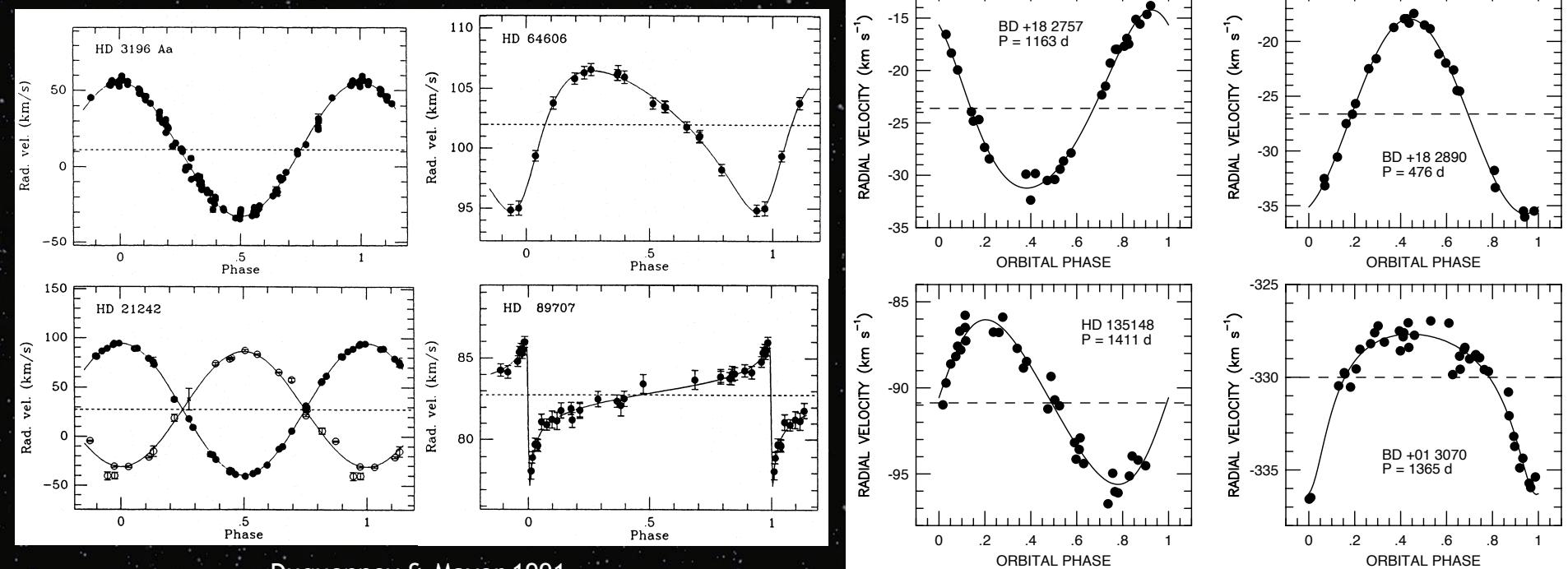
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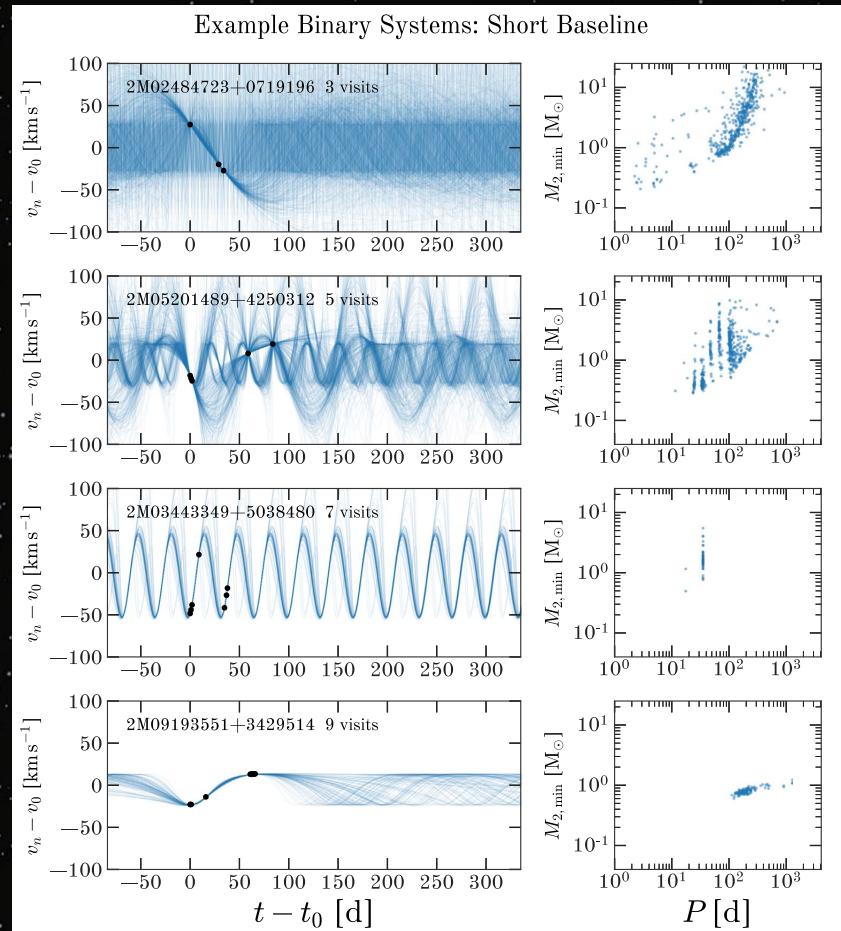
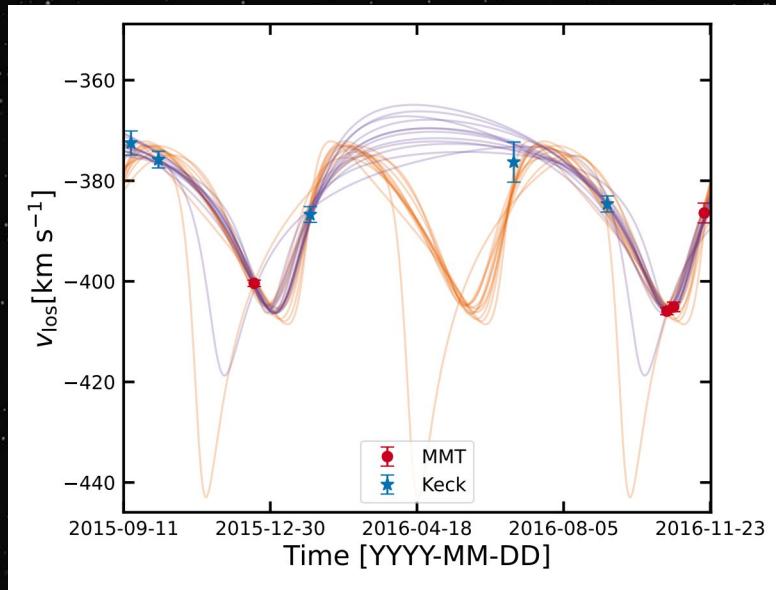


# EX: RV Curves - *Historical Approach*



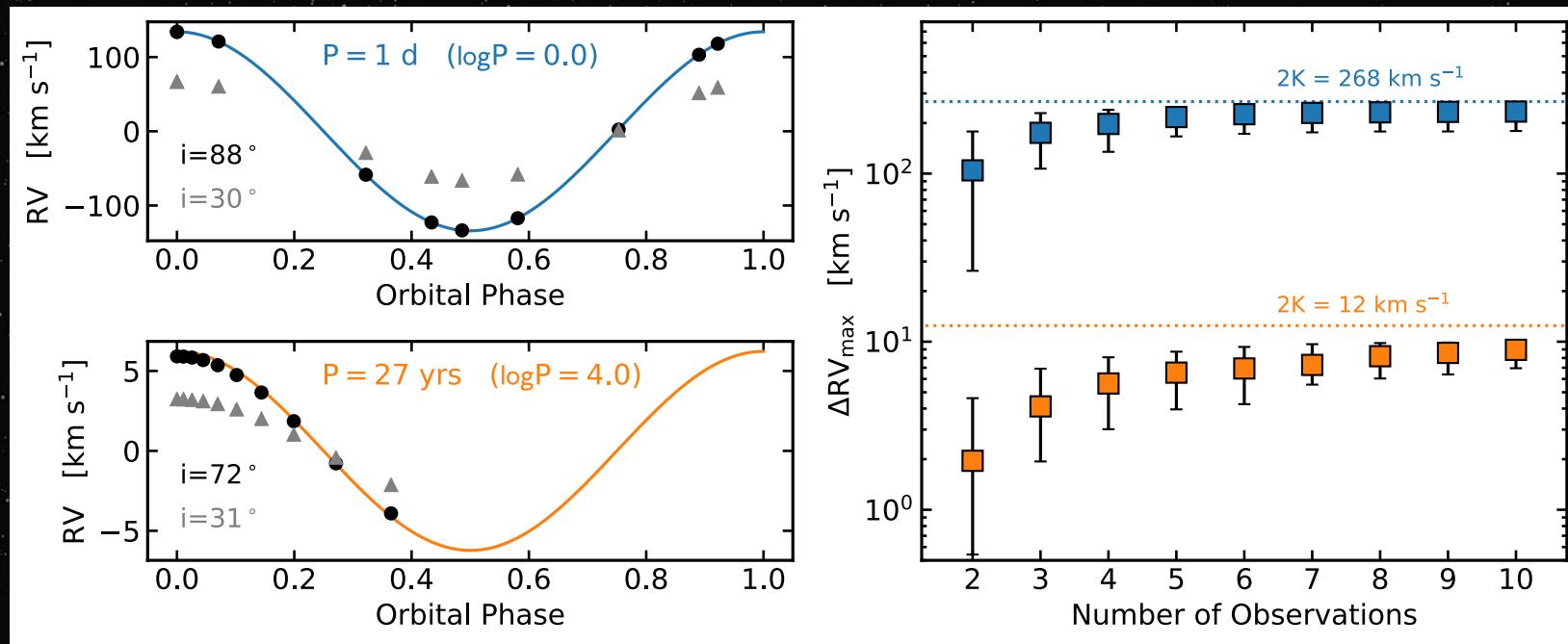
# EX: RV Curves - Modern Approach

Use the data you have +  
the leaps in computing of  
the last few decades!



# EX: Marginalize Over Inclination

Simulate 1000 systems with inclinations randomly sampled from a uniform distribution



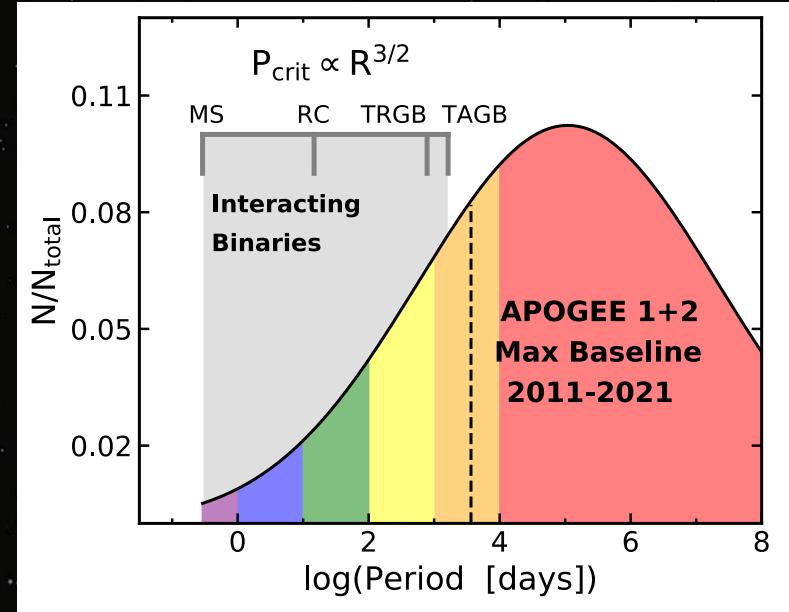
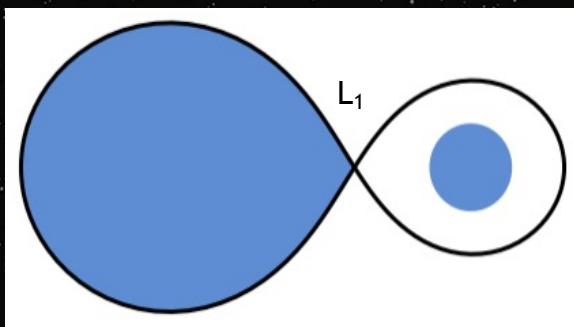
# EX: RV Curves - Sparsely-Sampled + $\Delta RV_{max}$

Raghavan+2010: lognormal  $P$  distribution for Sun-like stars in the Solar neighborhood

Mass transfer can occur when the primary overflows its Roche lobe!

Critical period for RLOF to occur at  $q = M_2/M = 1$ :

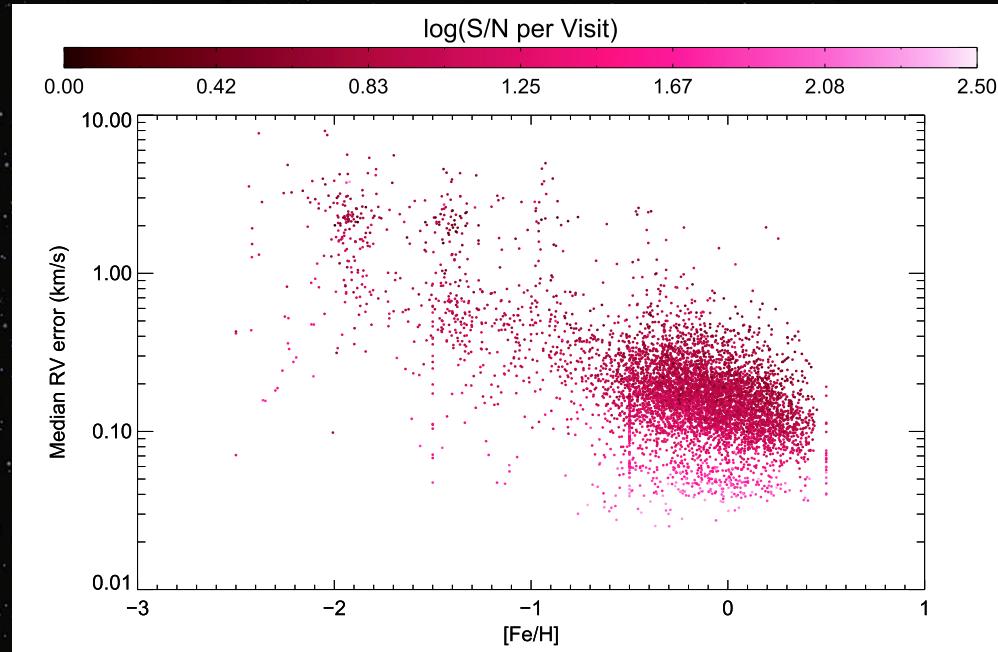
$$P_{crit} \propto \sqrt{\frac{R^3}{GM}}$$



$P_{crit}$  changes as the primary evolves:

- Increases as the star expands (ascends RGB)
- Decreases once the star shrinks (He fusion)

# EX: RV Errors - *Observed*



Troup+2016

APOGEE reports ~100 m/s

Milky Way Mapper (SDSS-V) hopes for 10 m/s!

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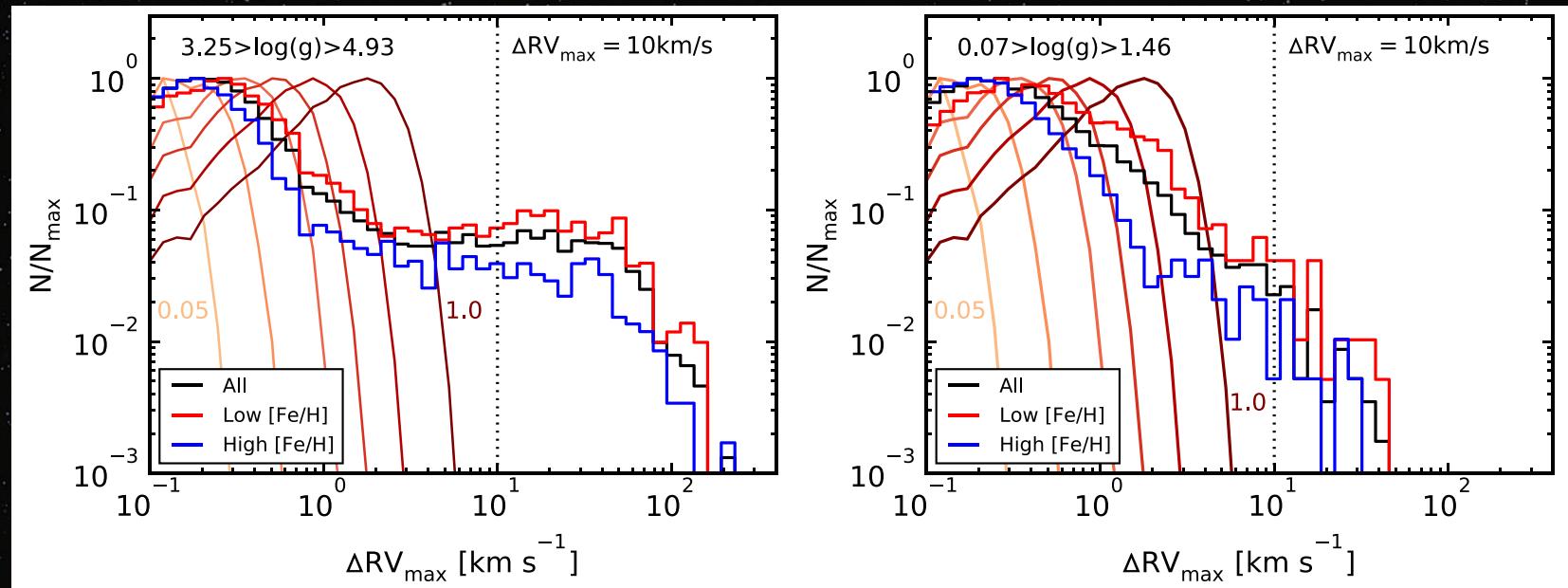
Truthfully, RV errors are hard...

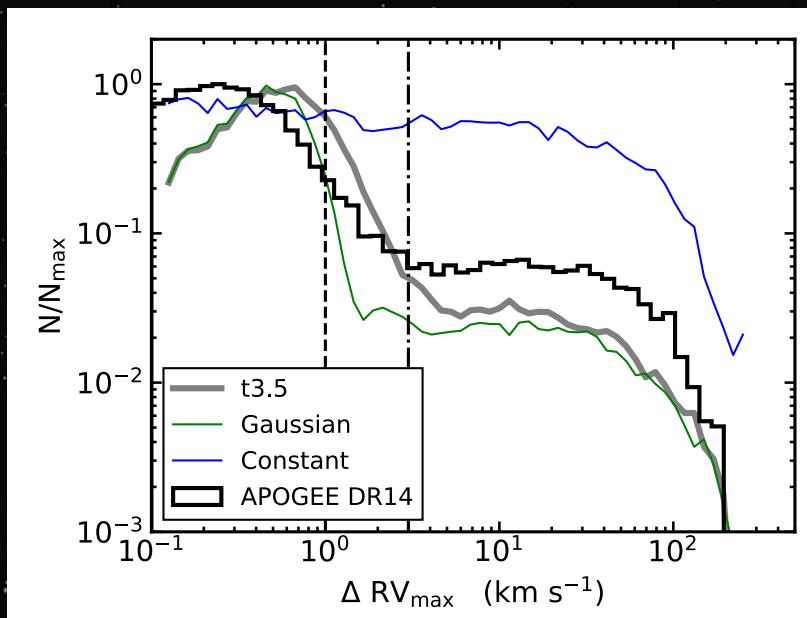
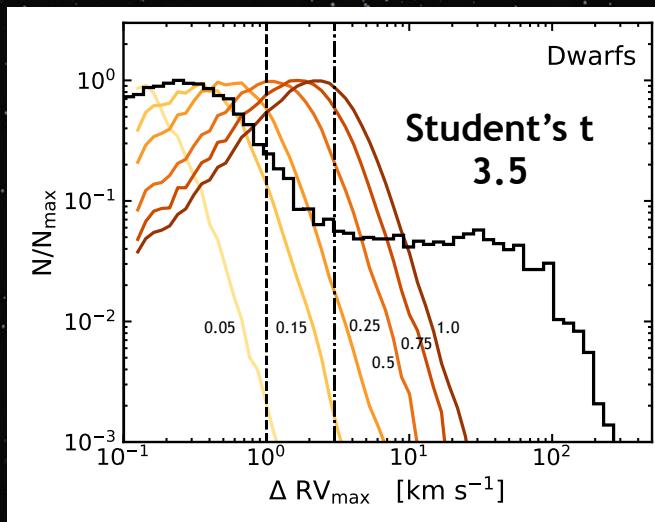
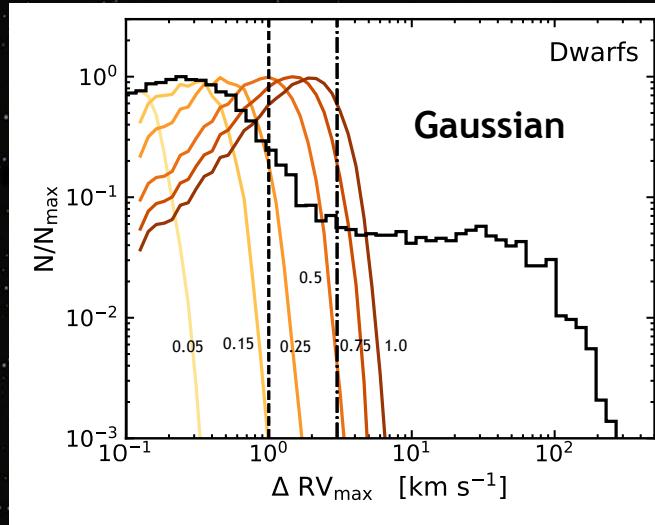
# EX: RV Errors - *Observed*

RV errors, and thus the  $\Delta RV_{\max}$  core, increase based on sample properties

- lower log(g) (RV jitter)
- lower [Fe/H] (weaker lines)

Badenes, CMD+2018

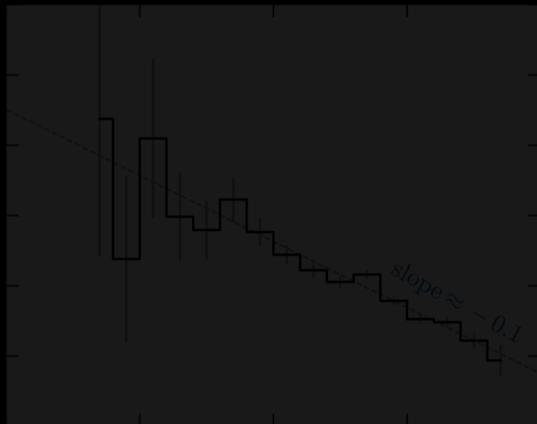
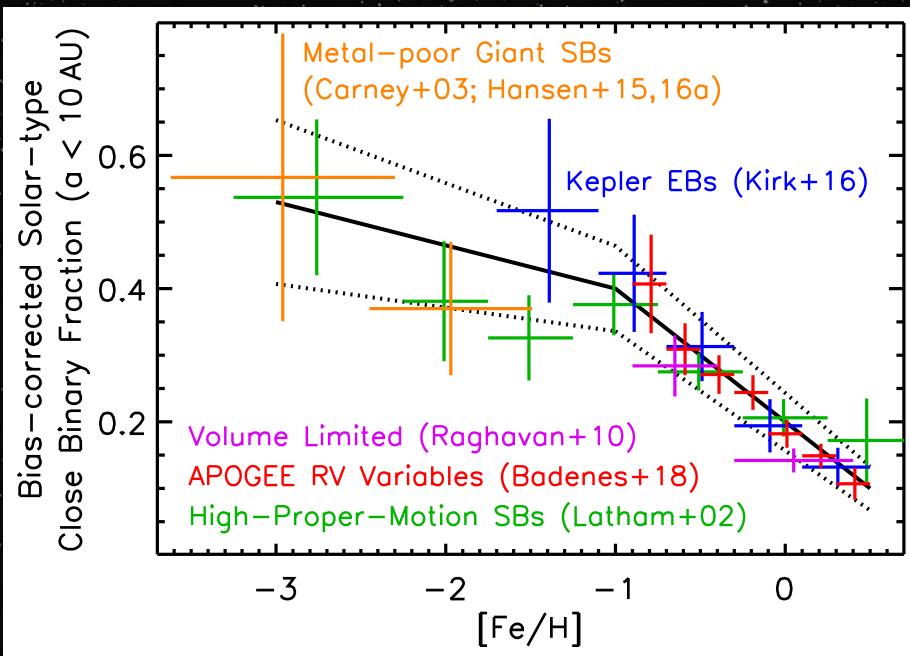




Some success modeling with a  
Student's t distribution as  
compared to Gaussian

# EX: CBF and Chemistry - Previous Studies

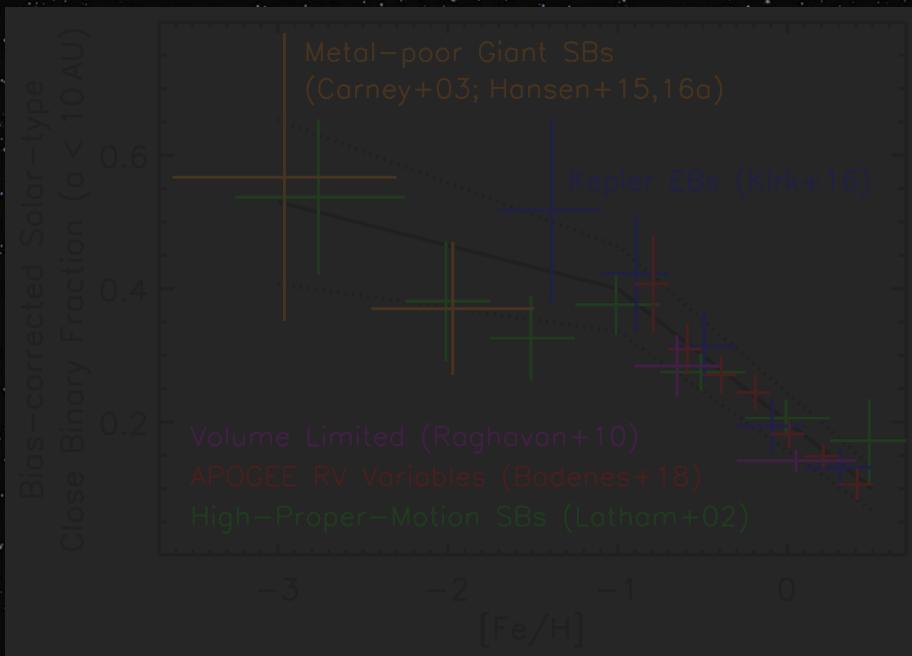
In APOGEE DR16, Price-Whelan+2020 found an anti-correlation between  $f_{bin}$  and [M/H].



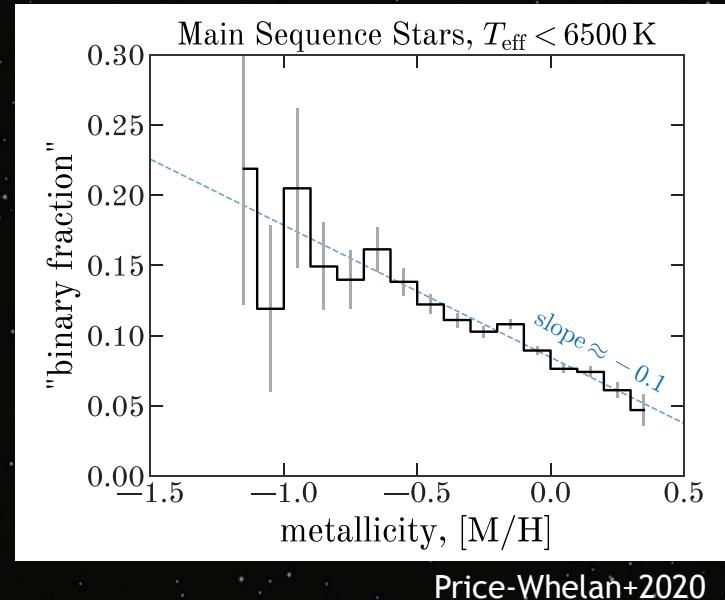
Meta-analysis by Moe, Kratter, & Badenes 2019 found that the CBF increased by a factor  $\sim 6$  across their  $[Fe/H]$  range after correcting for biases.

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Moe; Kratter, & Bädenes 2019.

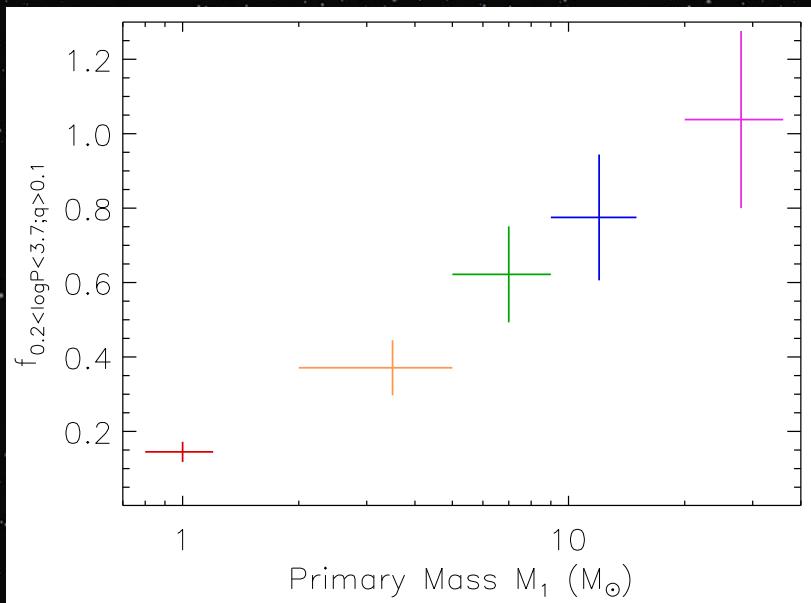


Price-Whelan+2020

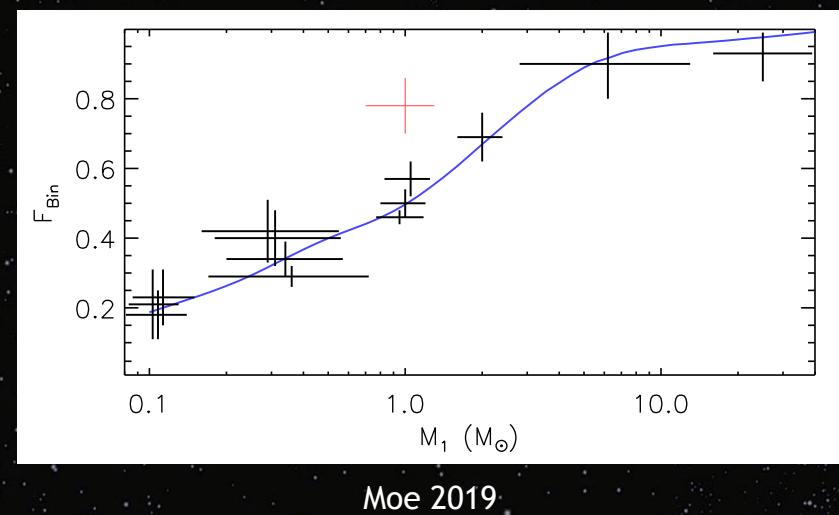
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# EX: CBF and Stellar Mass/T<sub>eff</sub>

Primary mass is strongly correlated with the close binary fraction.



Moe & Di Stefano 2017



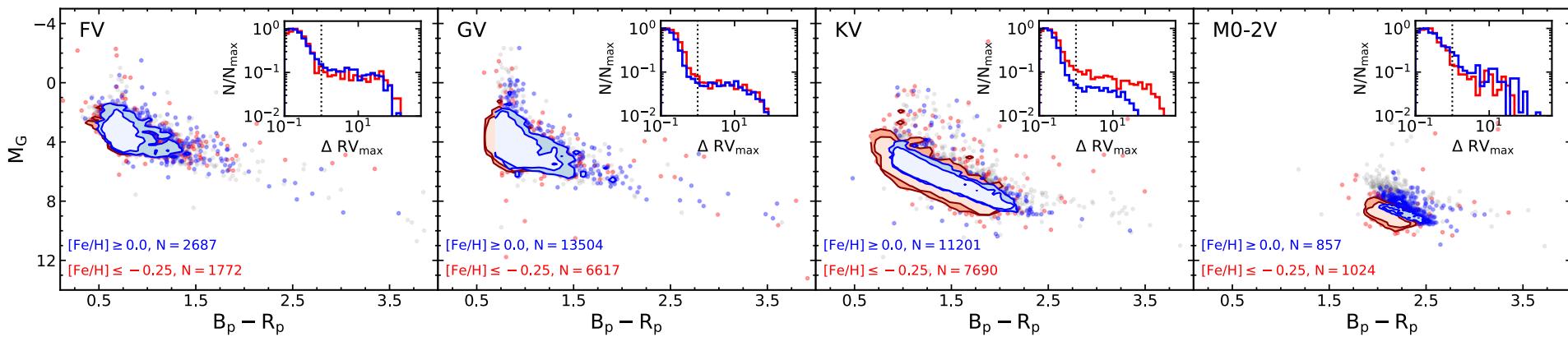
Moe 2019

red point is for solar-type pre-MS stars

# EX: CBF and M dwarfs - Preliminary Data

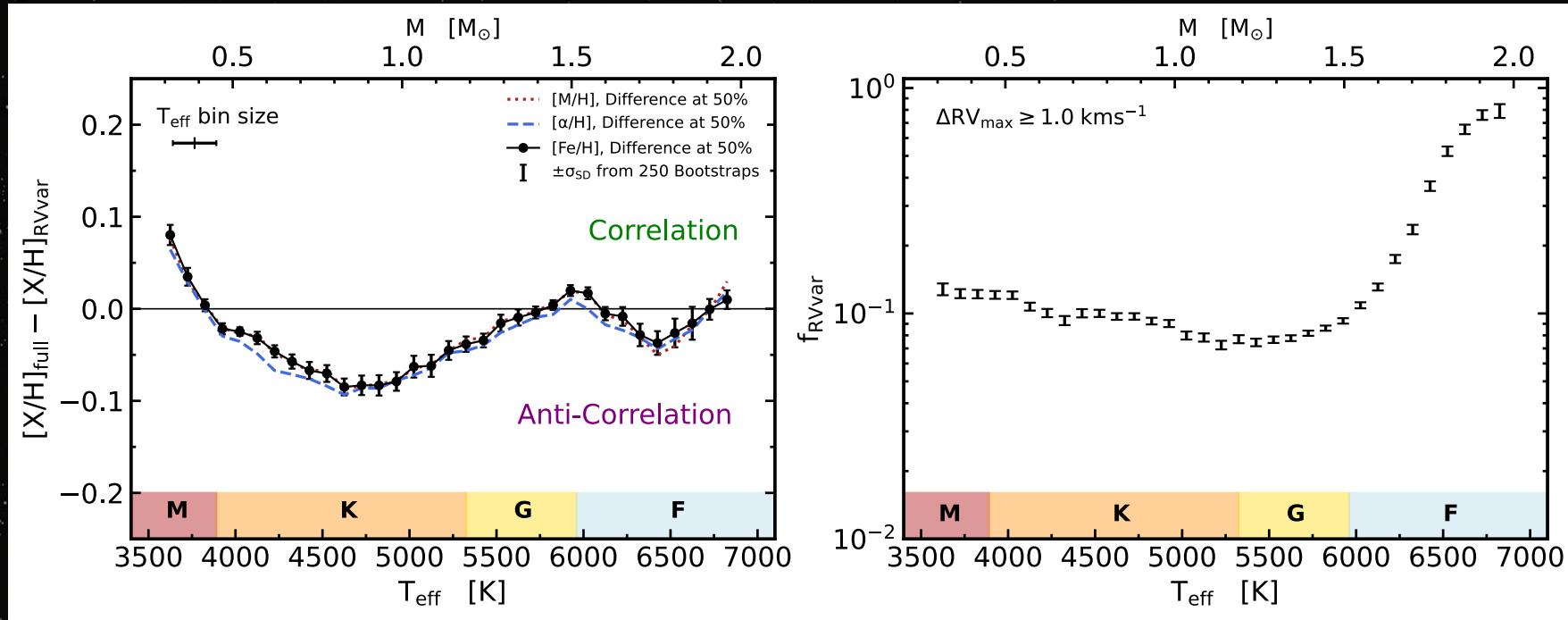
- APOGEE DR17 RVs,  $T_{\text{eff}}$ ,  $\log(g)$ , chemical abundances
- Gaia EDR3 Bailer-Jones distances
- HR-select dwarfs,  $T_{\text{eff}}$ -assign M K G F

Spectral Type	$T_{\text{eff}}$ Range	$\log(g/\text{cm s}^{-2})$ Range	N	$N_{\text{RV variable}}^1$
F	5960 – 7220	3.39 – 4.69	8125	1304
G	5325 – 5960	3.55 – 4.75	31965	2625
K	3890 – 5325	4.15 – 5.26	36540	3422
M0-2	3500 – 3890	4.36 – 5.20	4033	511



Daher+2022 (in prep)

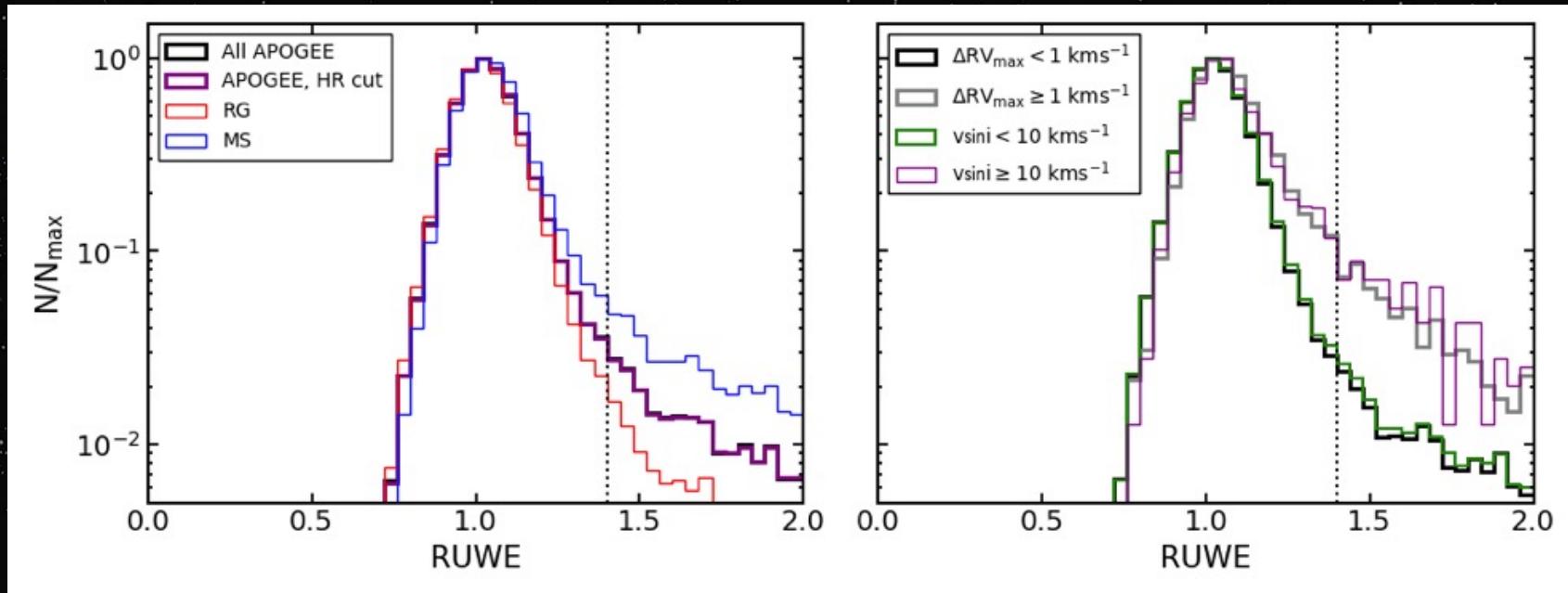
# EX: CBF and M dwarfs - *Preliminary Results*



Daher+2022 (in prep)

See a very strong trend with in  $T_{\text{eff}}$  / mass!

# EX: CBF and Rotation - *Gaia RUWEs*



- RUWEs are larger for MS than for RG
- RUWEs are larger for RV variables and rapid rotators

