



Sun

Earth

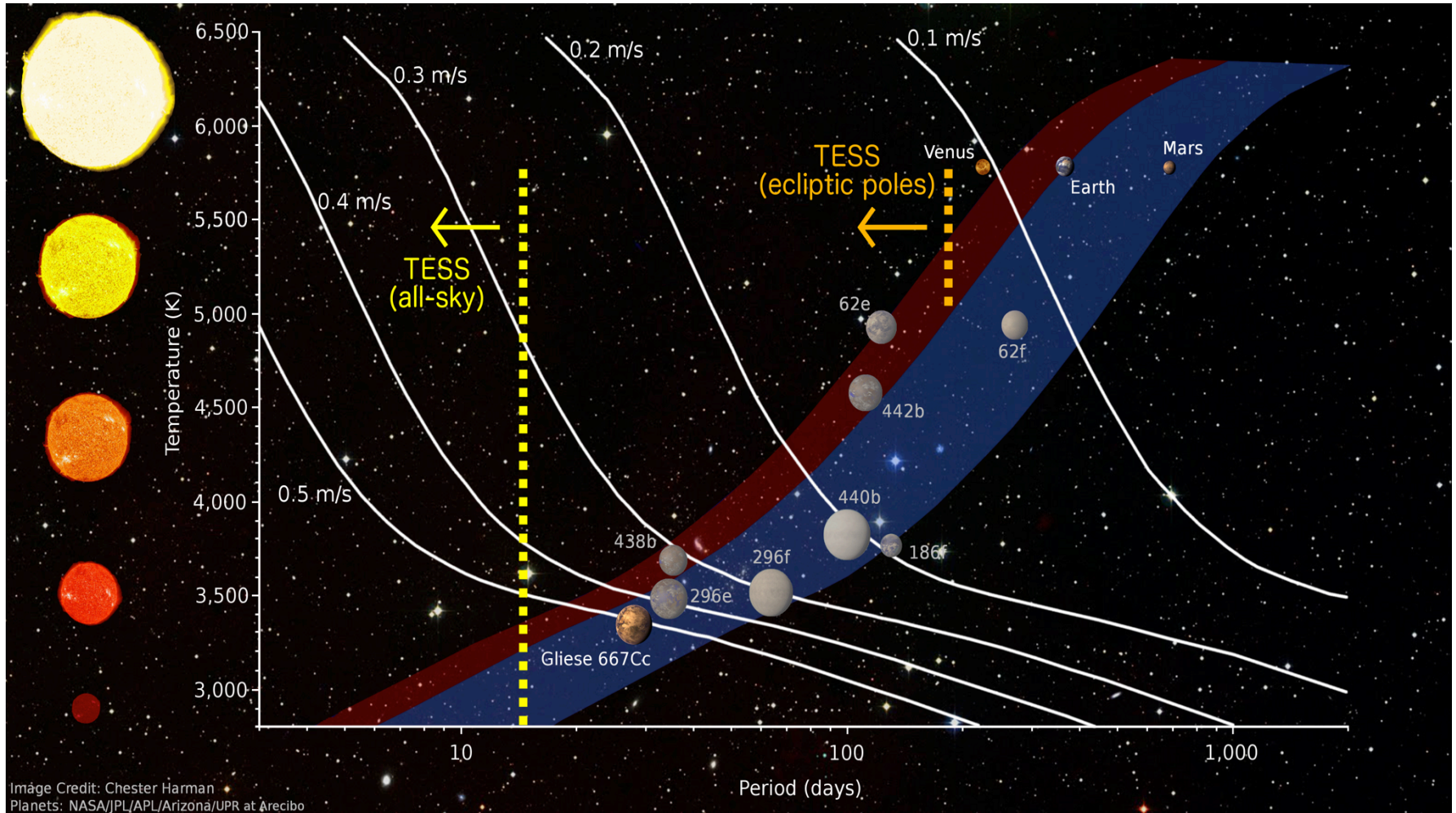


# Observational Needs for *Radial Velocity Surveys*

**RV** × **K2**.com

Sharon Xuesong Wang  
Carnegie Fellow @ DTM

# Measuring masses for transiting planets.





# No RV detections for transiting HZ planets **yet.**

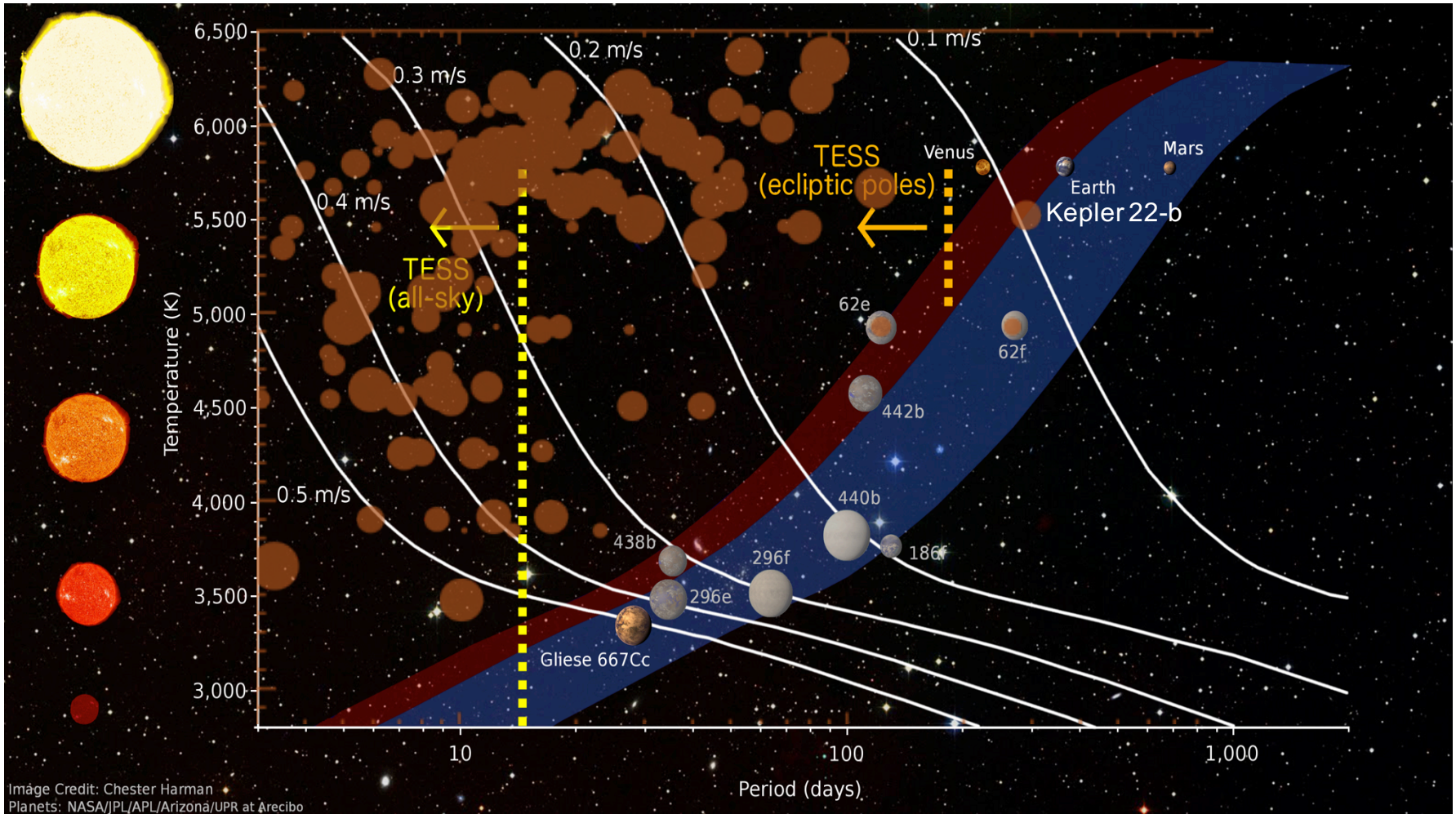
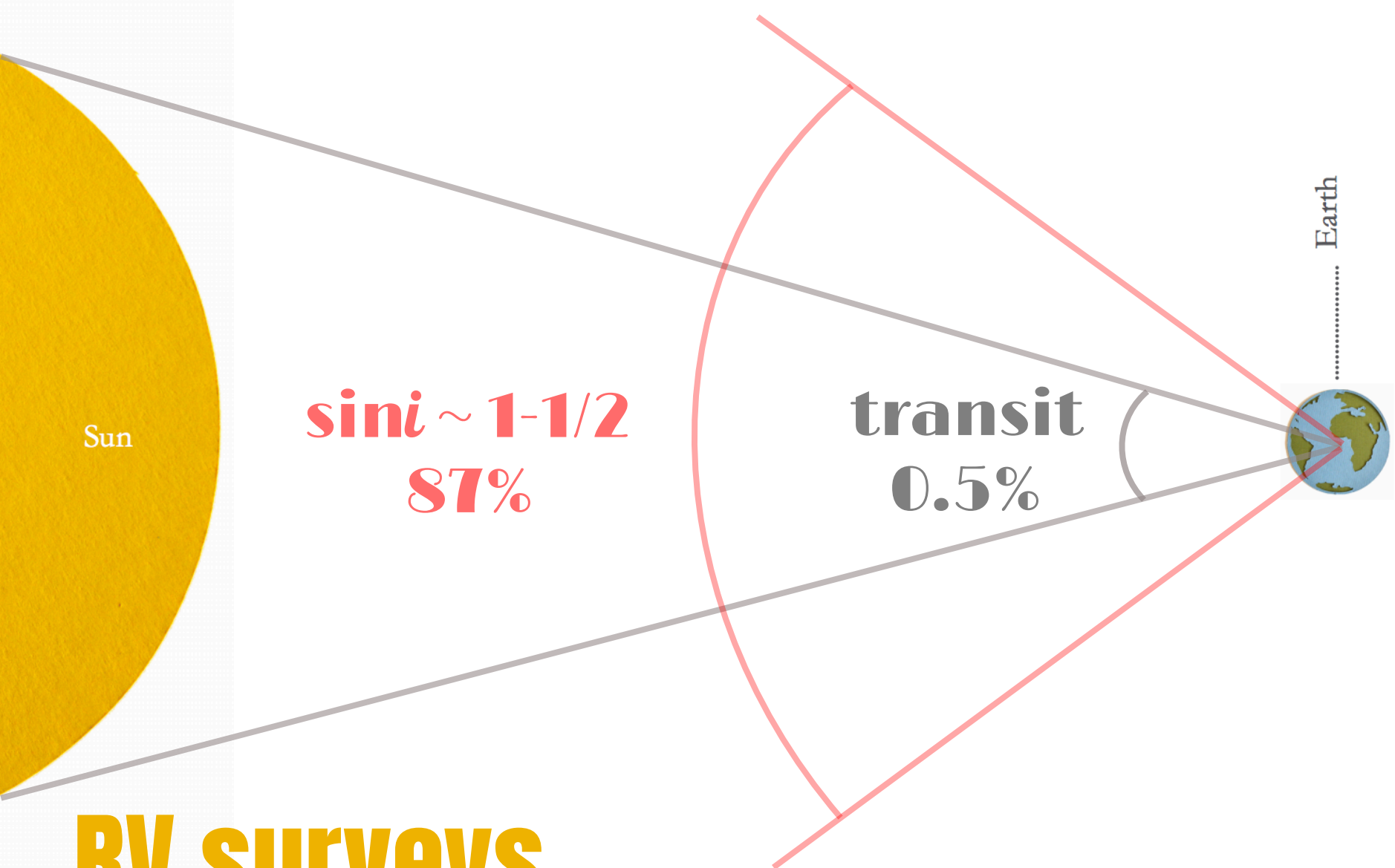


Image Credit: Chester Harman  
Planets: NASA/JPL/APL/Arizona/UPR at Arecibo



# RV surveys

find & characterize the **nearest**  
HZ planets, especially Earth analogs



# **Observational Needs** for RV Surveys

**Lots and lots of spectra**

**...and photometry**

**...and images**

# Observational Needs for RV Surveys

## Target Selection

Stellar Multiplicity

Imaging

Stellar Jitter+Activity Level

Photometry  
Spectroscopy

---

## Survey Design

Stellar Jitter+Activity  
Characteristics

Photometry  
Spectroscopy

---

## Data Interpretation

Stellar Jitter+Activity  
Characteristics

Photometry  
Astrometry  
Spectroscopy

Stellar Parameters

# Observational Needs for RV Surveys

## Target Selection

Stellar Multiplicity

Imaging

**Stellar Jitter+Activity Level**

Photometry  
Spectroscopy

---

## Survey Design

**Stellar Jitter+Activity  
Characteristics**

Photometry  
Spectroscopy

---

## Data Interpretation

**Stellar Jitter+Activity  
Characteristics**

Photometry  
Astrometry  
Spectroscopy

Stellar Parameters



# Observational Needs for RV Surveys

## Target Selection

Stellar Multiplicity

Imaging

**Stellar Jitter+Activity-Level**

Photometry  
Spectroscopy

---

## Survey Design

**Stellar Jitter+Activity  
Characteristics**

Photometry  
Spectroscopy

---

## Data Interpretation

**Stellar Jitter+Activity-  
Characteristics**

Photometry  
Astrometry  
Spectroscopy

Stellar Parameters

# Observational Needs for RV Surveys

## Target Selection

Stellar Multiplicity

Imaging

**Stellar Variation Level**

Photometry  
Spectroscopy

---

## Survey Design

**Stellar Variation Characteristics**

Photometry  
Spectroscopy

---

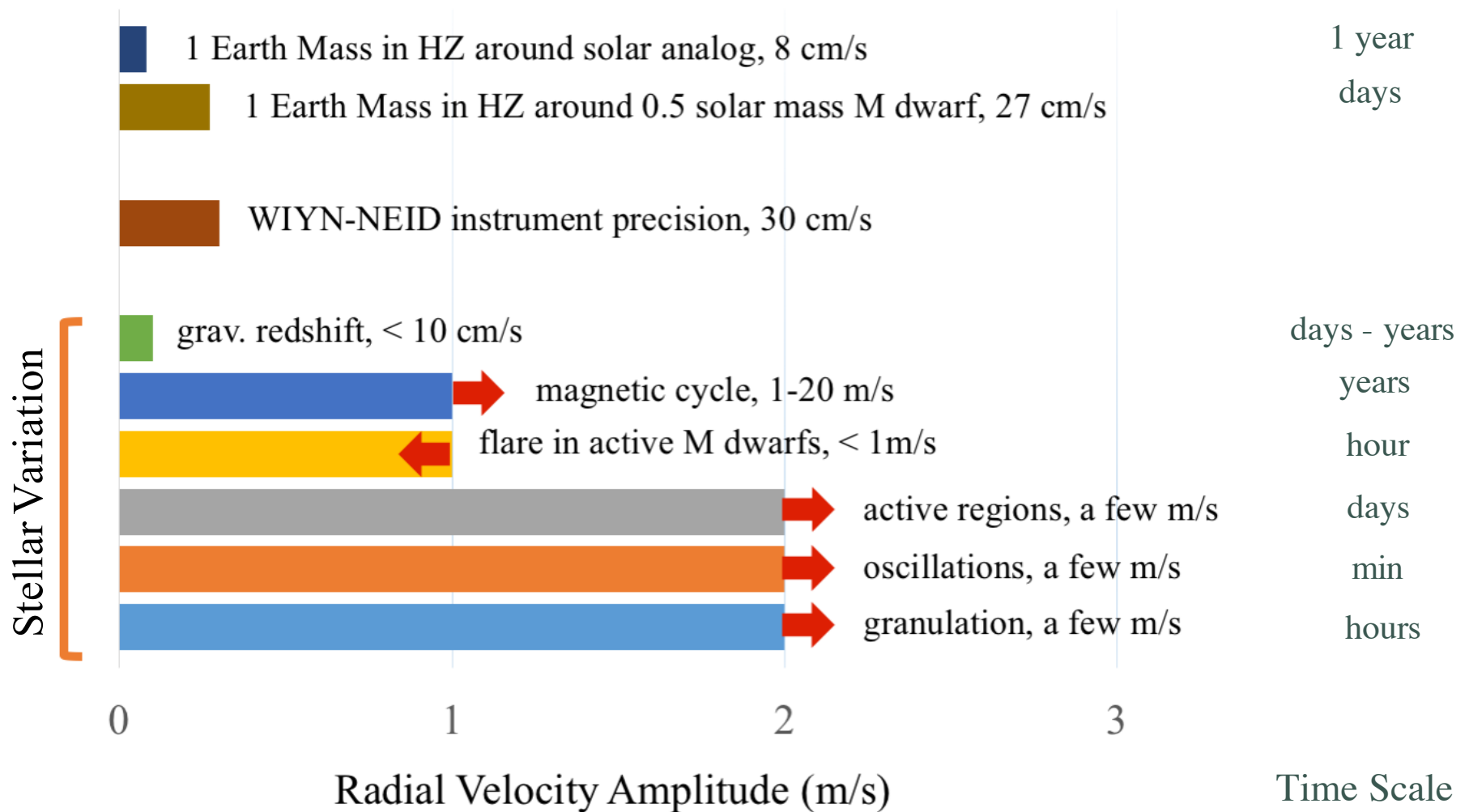
## Data Interpretation

**Stellar Variation Characteristics**

Photometry  
Astrometry  
Spectroscopy

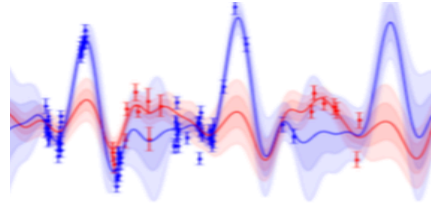
Stellar Parameters

# Stellar variation holds the tallest tent pole in RV error budget.





# Stellar Variation



**Overall Amplitude**

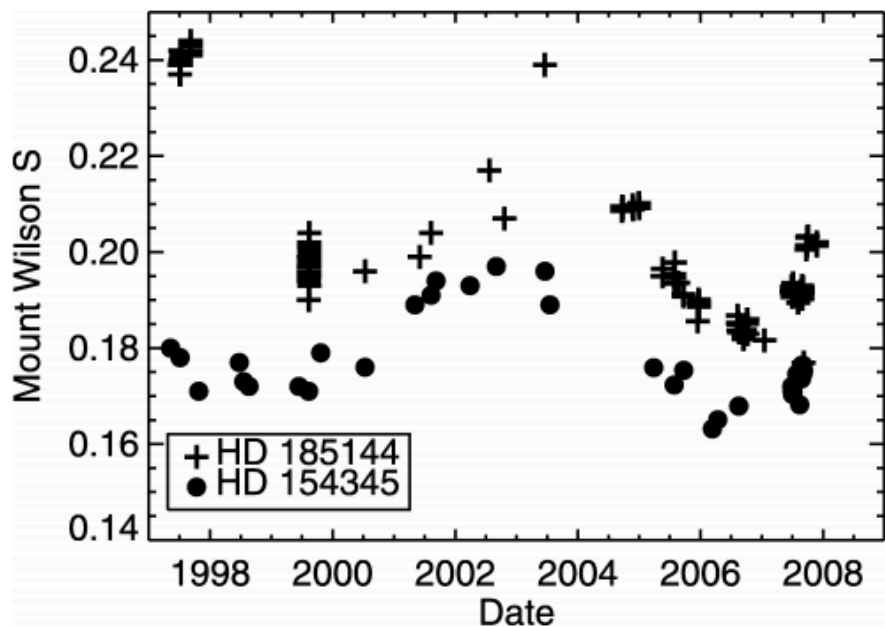
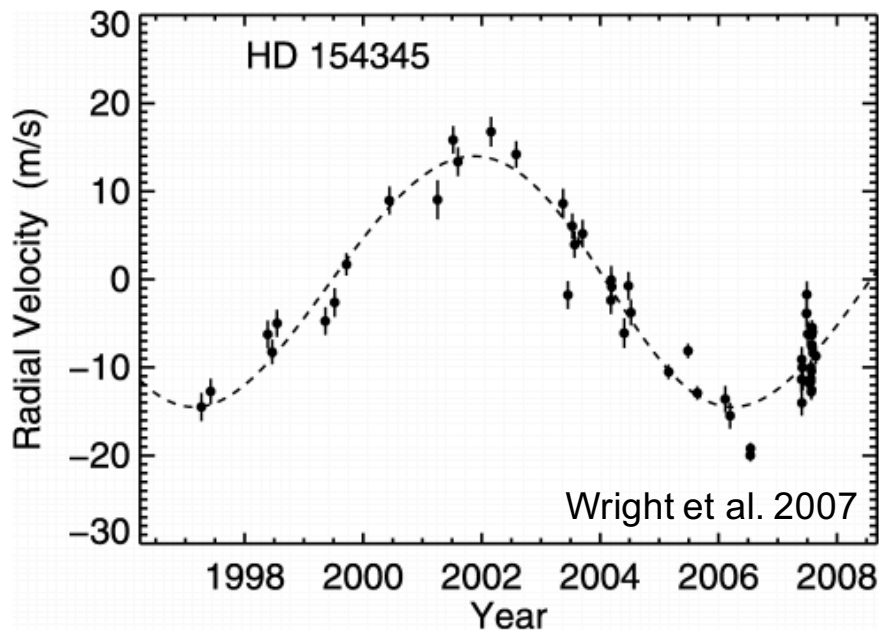


**Temporal Behavior**

photometric variation  
spectroscopic indicators  
(single epoch)

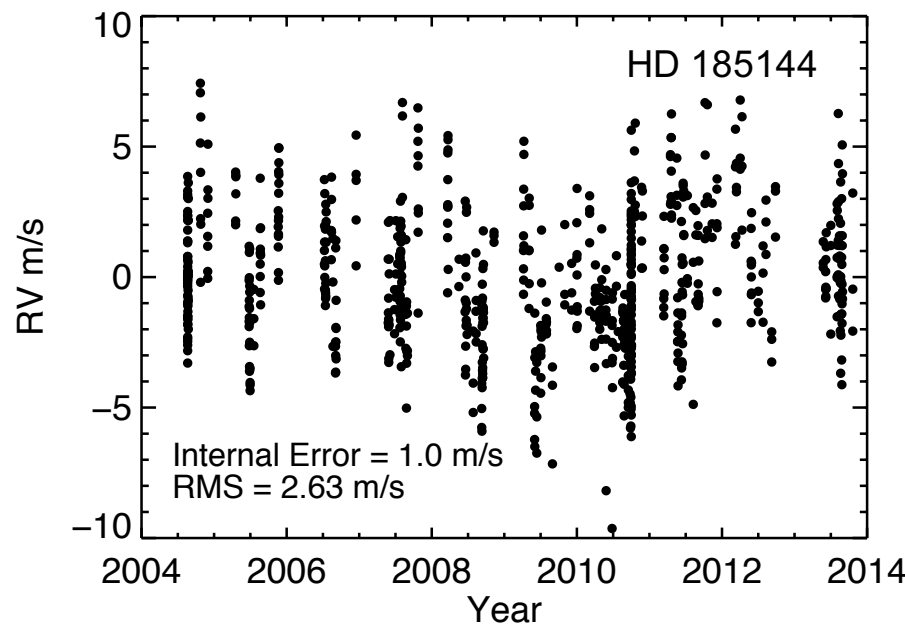
e.g. Ca H&K, flicker (log g)

photometric variation  
spectroscopic indicator variation

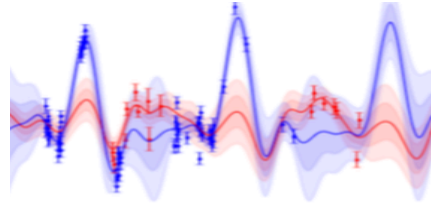


the extreme example:  
HD 154345

Wright 2016 arXiv:1603.08384



# Stellar Variation



**Overall Amplitude**



**Temporal Behavior**

photometric variation  
spectroscopic indicators  
(single epoch)

e.g. Ca H&K, flicker (log g)

photometric variation  
spectroscopic indicator variation



# Goal

A grasp on the **temporal** behavior of stellar variations:  
what they look like, and how to deal with them.

# Stellar Activity

Activity-induced RV signals arise from the rotational modulation and intrinsic evolution of magnetized regions, and are thus naturally **correlated in time**, often **quasi-periodic**, and **non-stationary**.

Aigrain, Pont & Zucker, 2012

# Ways to Mitigate Stellar Activity

- Correlate RVs with spectral activity indicators and remove  
e.g. Saar et al 1998, Queloz et al. 2001

# Ways to Mitigate Stellar Activity

- Correlate RVs with spectral activity indicators and remove  
e.g. Saar et al 1998, Queloz et al. 2001
  
- “Model out” rotation period and harmonics  
e.g. Boisse et al. 2011

# Ways to Mitigate Stellar Activity

- Correlate RVs with spectral activity indicators and remove  
e.g. Saar et al 1998, Queloz et al. 2001
- “Model out” rotation period and harmonics  
e.g. Boisse et al. 2011
- Photometry informed spot modeling, FF’, GP, or a combination  
e.g. Haywood et al. 2014

# Improve

## Ways to Mitigate Stellar Activity

- Correlate RVs with spectral activity indicators and remove  
e.g. Saar et al 1998, Queloz et al. 2001

Find better spectral indicators (e.g. Robertson et al. 2016);

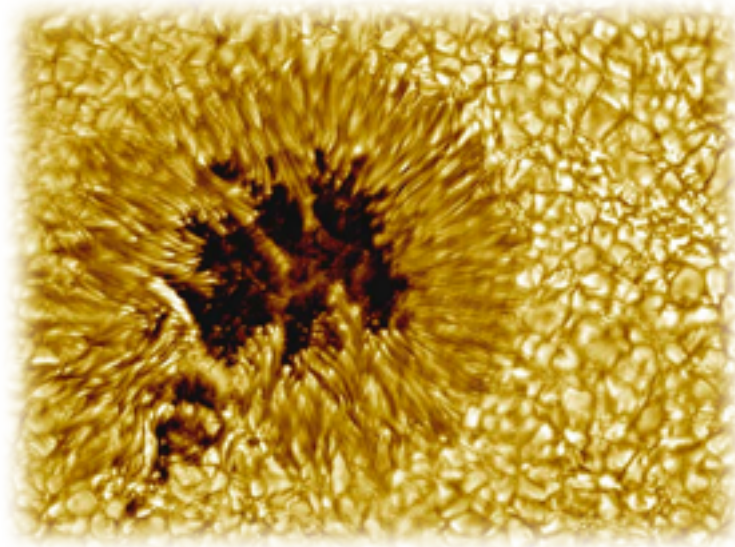
Use better techniques (e.g. Rajpaul et al. 2015a).

- “Model out” rotation period and harmonics  
e.g. Boisse et al. 2011

Use better techniques (e.g. Gregory 2016 as in Dumusque et al. 2017).

- Photometry informed spot modeling, FF', GP, or a combination  
e.g. Haywood et al. 2014

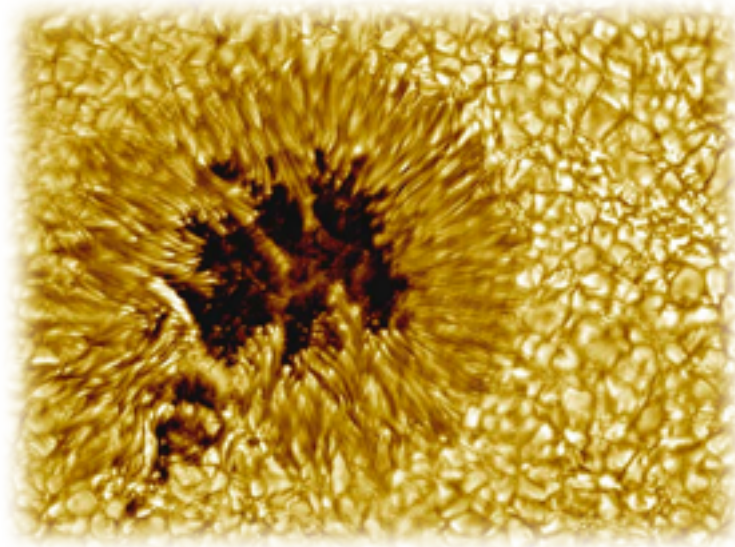
**Can we get rid of photometry and  
make more efficient use of the data?**



**photometric  
variation**

**RV  
variation**



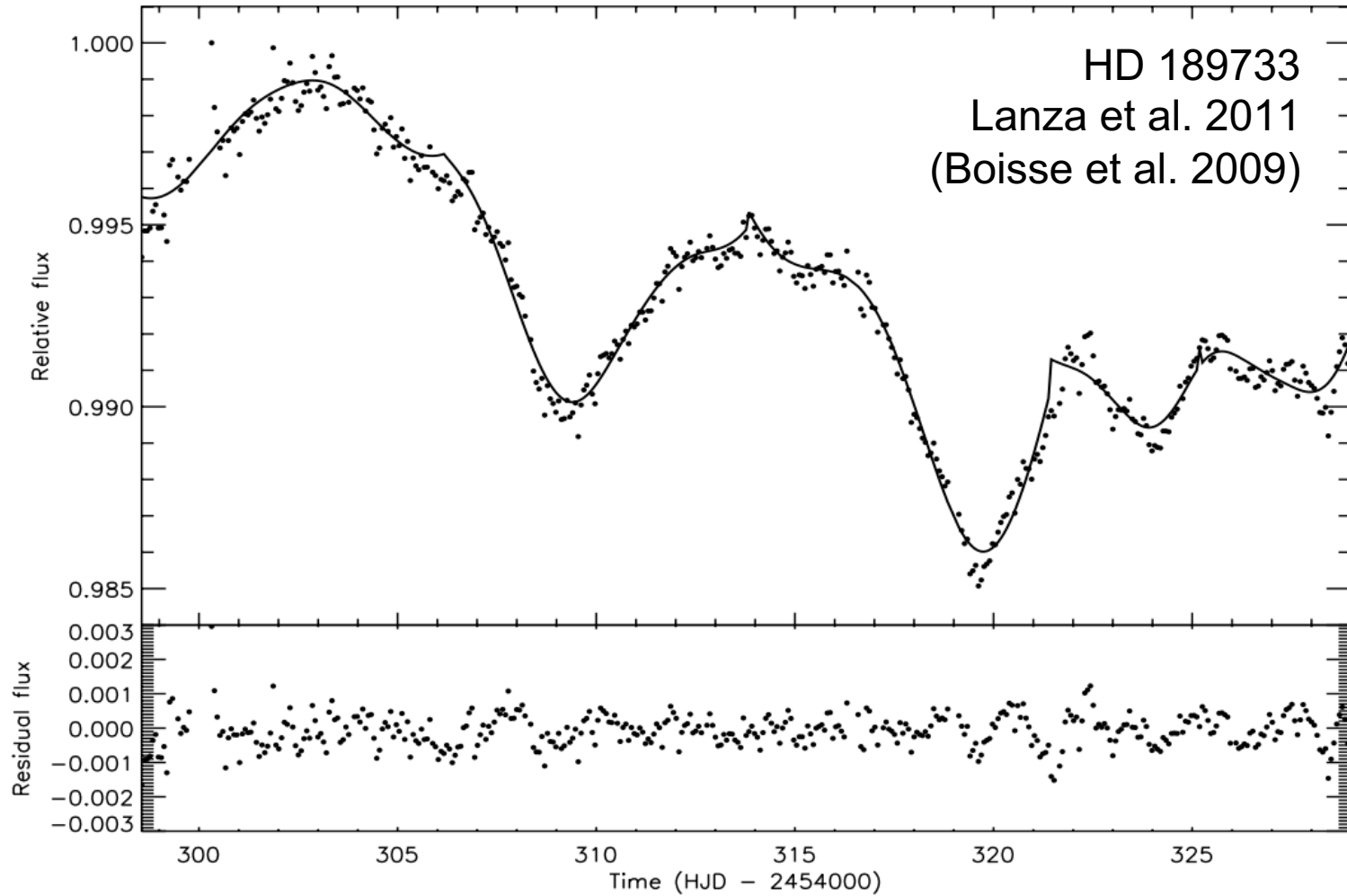


**photometric  
variation**

**RV  
variation**

- ✓ time scale
- ✓ amplitude

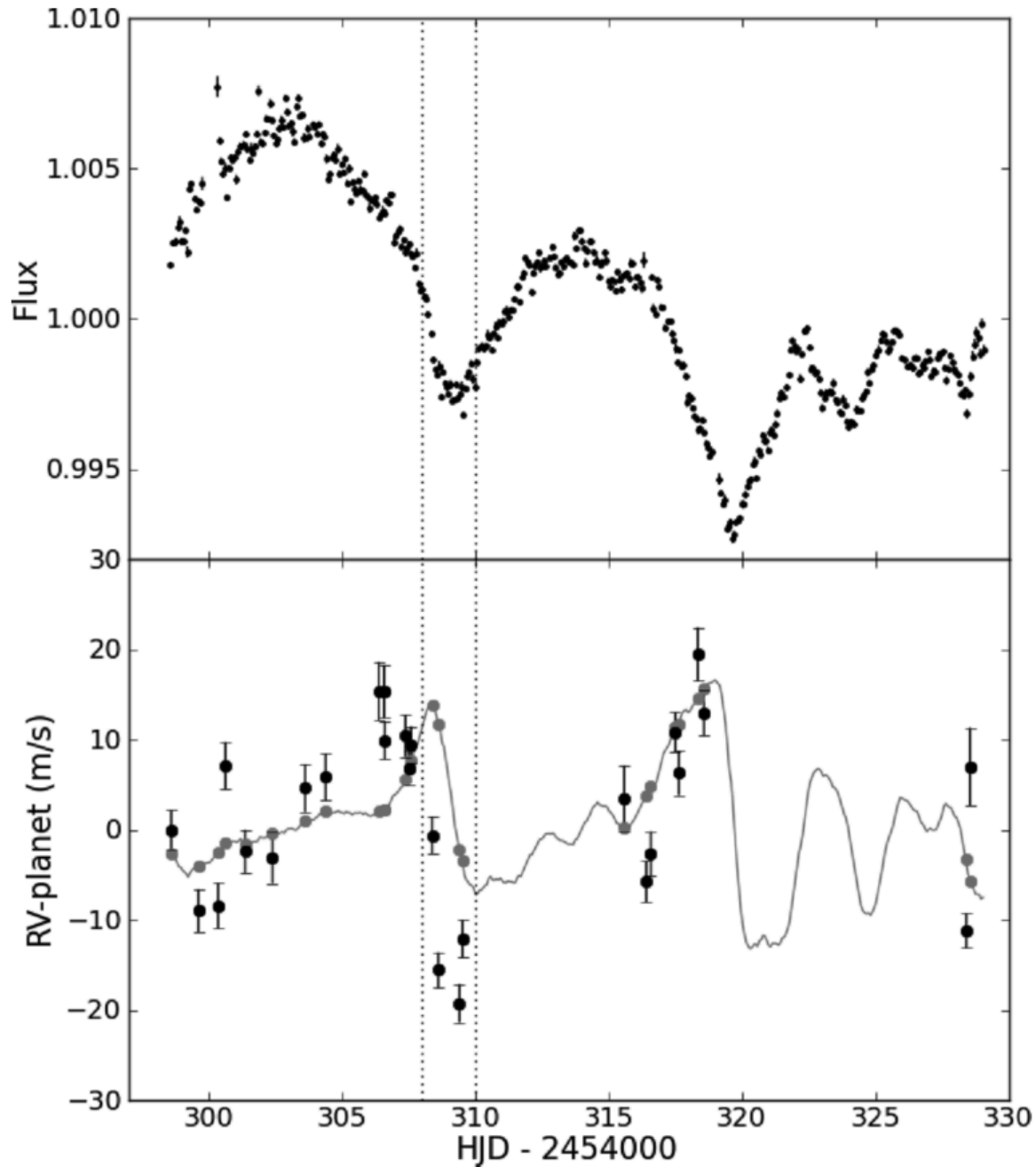
# Simultaneous MOST photometry + spot modeling



# FF' method

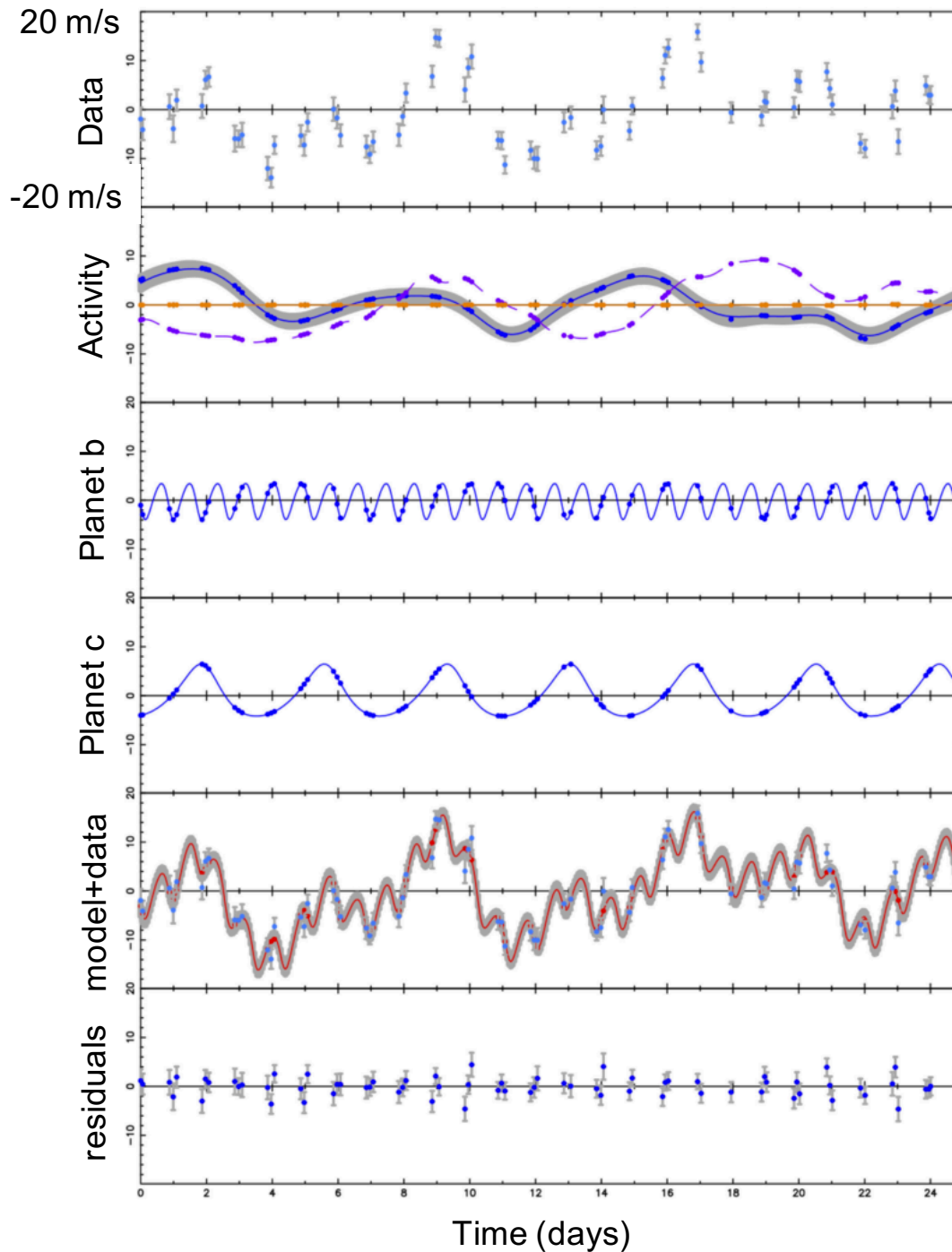
HD 189733

Aigrain, Pont & Zucker 2012



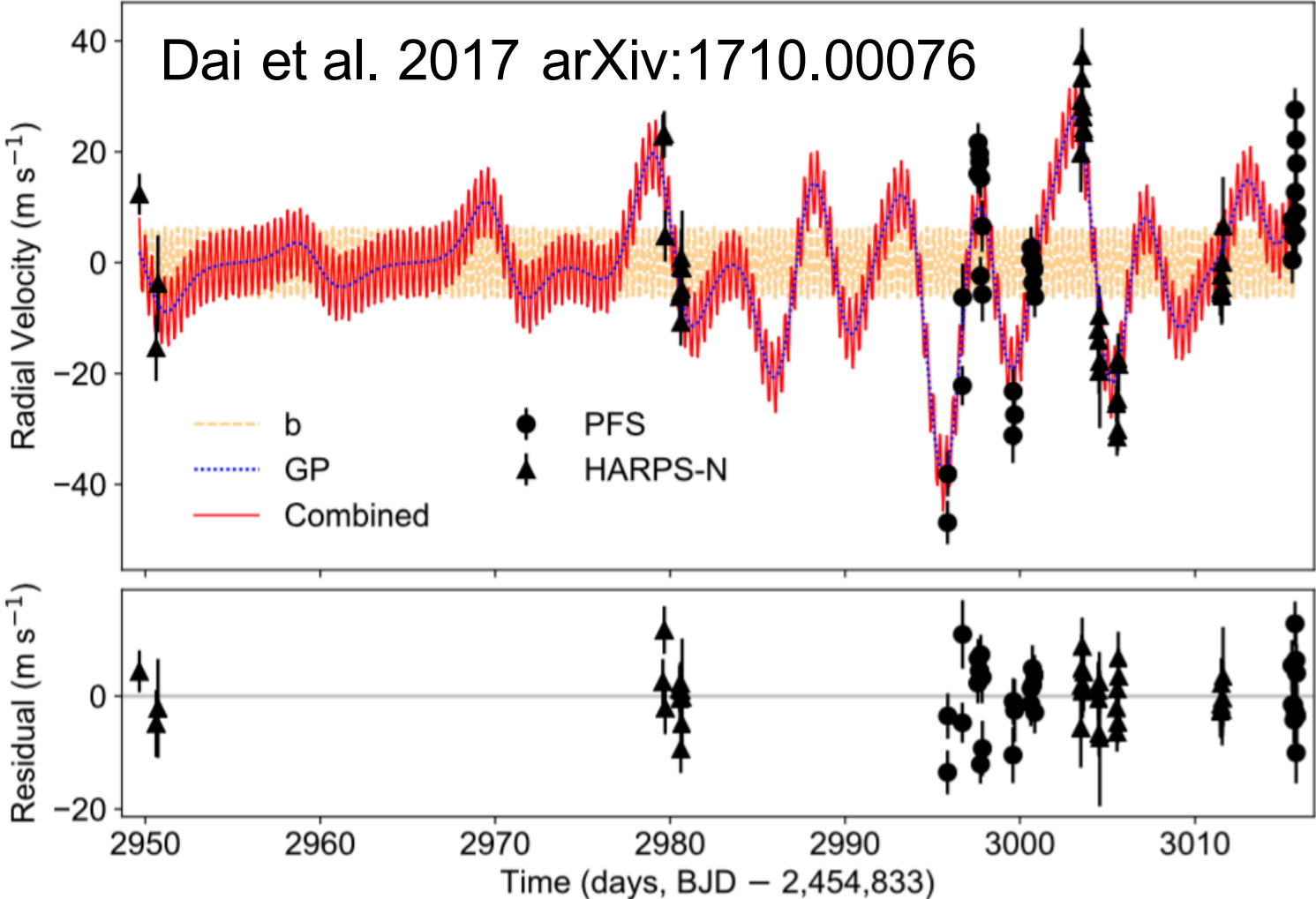
# CoRoT photometry informs Gaussian Process

CoRoT-7  
Haywood et al. 2014

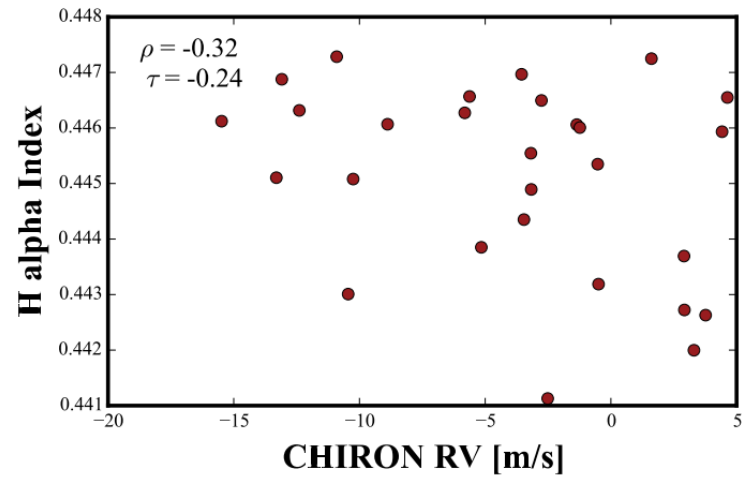
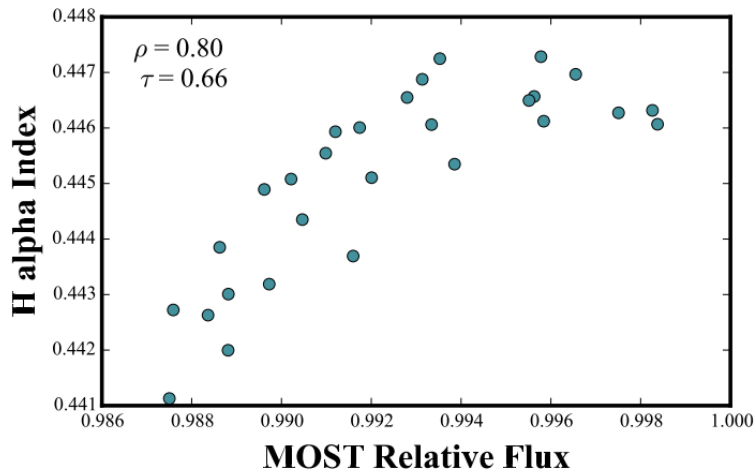
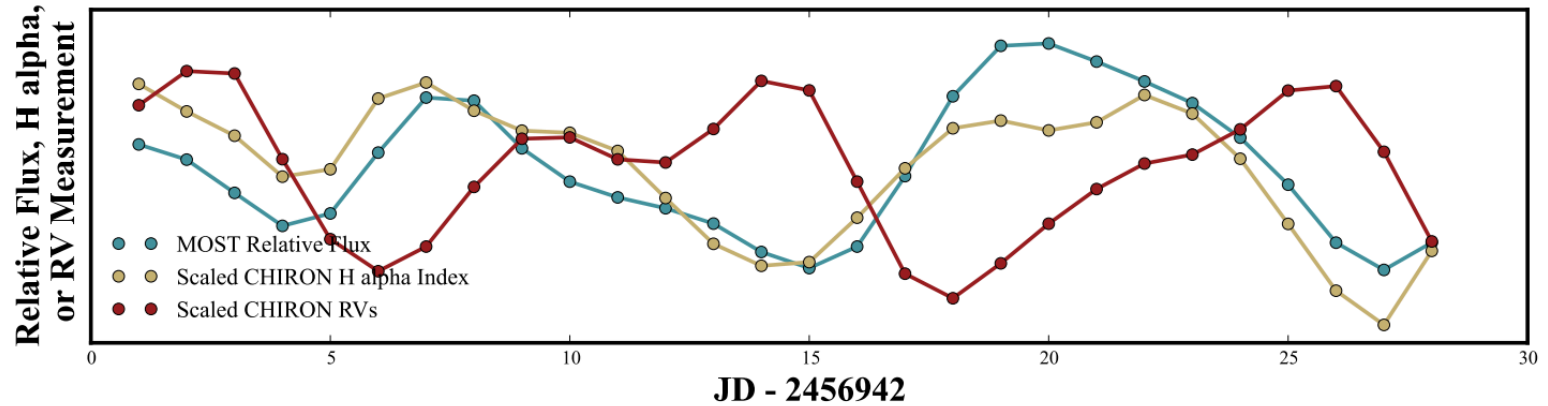


# An ultra short period sub-Neptune discovered by K2

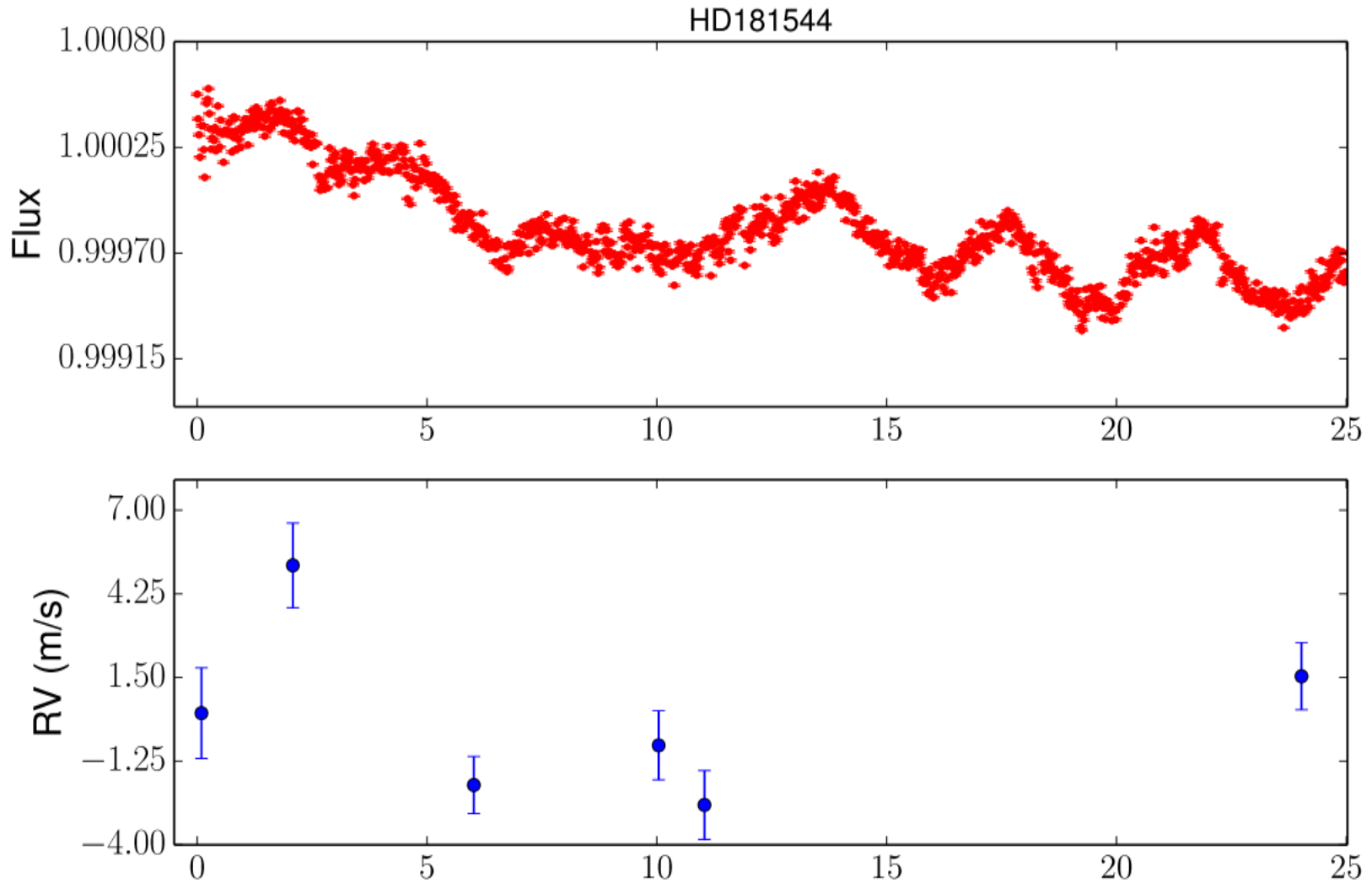
contemporaneous  
ground photometry



# Simultaneous photometry can help identify spectroscopic indicators.



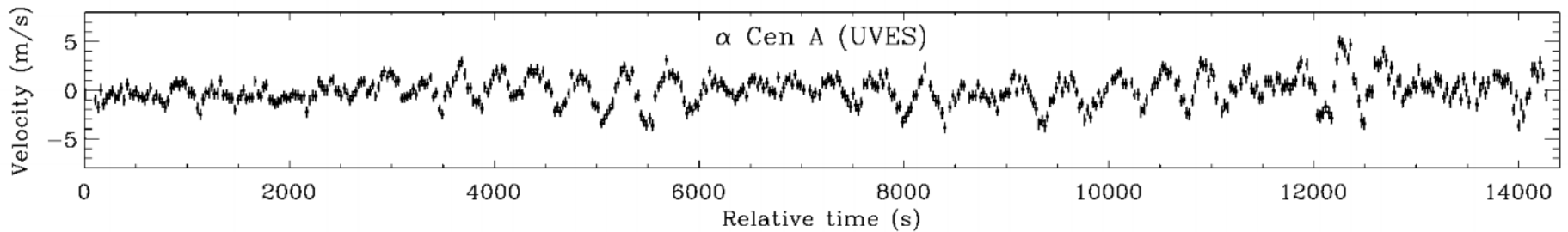
# Simultaneous HARPS RVs with K2 Campaign 7 & 8





**But what about stellar jitter?**

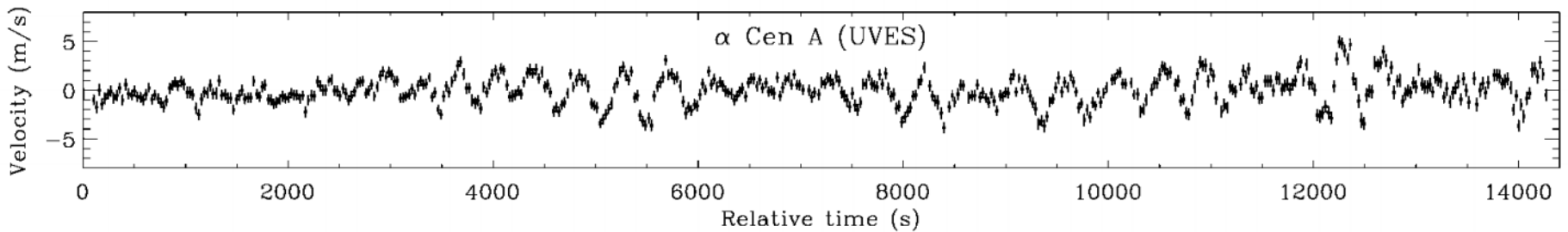
# Stellar oscillation is a significant source of jitter.



Butler et al. 2004

Averaging strategy: Dumusque et al. 2011

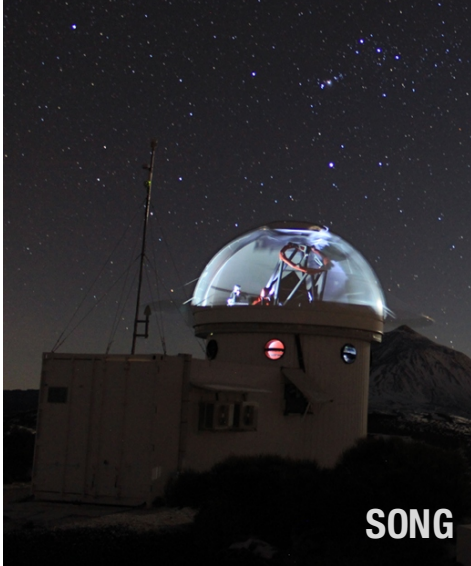
# Stellar oscillation is a significant source of jitter.



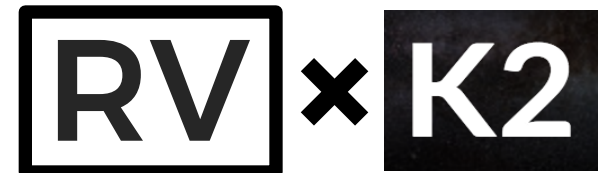
Butler et al. 2004

Averaging strategy: Dumusque et al. 2011

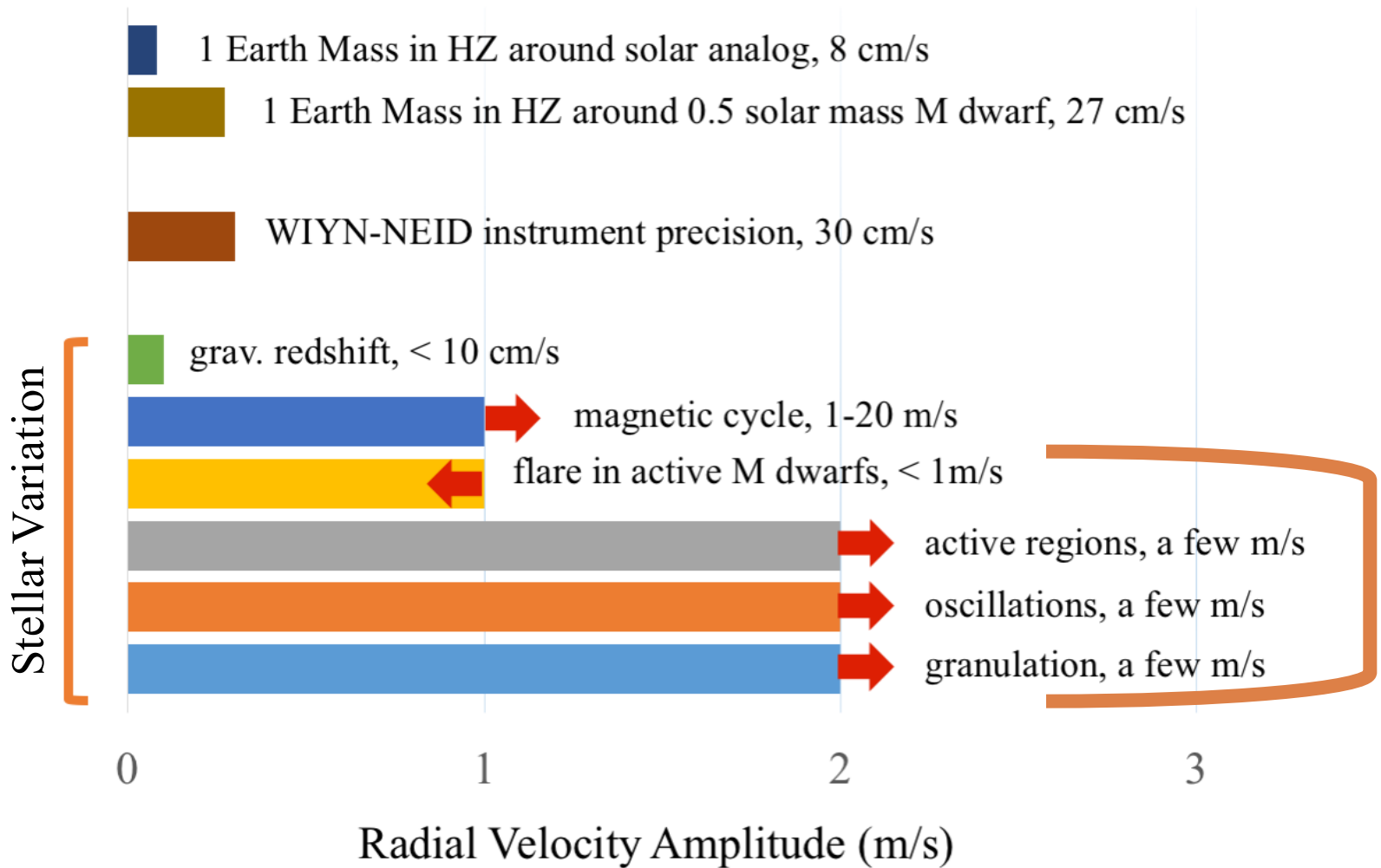
## But what about granulation?



study **stellar jitter & activity**  
with **simultaneous**  
precise RV and Kepler/K2 light curve



# RV × K2



# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

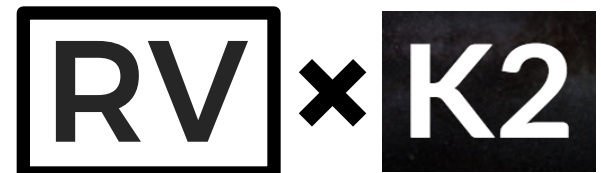
---

HD 76445	7.6	G5 IV
HIP 44072	9.3	M0 V
HD 76780	7.6	G5 V
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

## K2 30-min Cadence

---

HIP 43418	9.3	K0 V
HIP 42783	10.1	K7 V



# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

---

HD 76445	7.6	G5 IV
HIP 44072	9.3	M0 V
HD 76780	7.6	G5 V
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

**simultaneous**  
**RV+photometry**  
**asteroseismology**

## K2 30-min Cadence

---

HIP 43418	9.3	K0 V
HIP 42783	10.1	K7 V



# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

---

HD 76445	7.6	G5 IV
HIP 44072	9.3	M0 V
HD 76780	7.6	G5 V
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

## K2 30-min Cadence

---

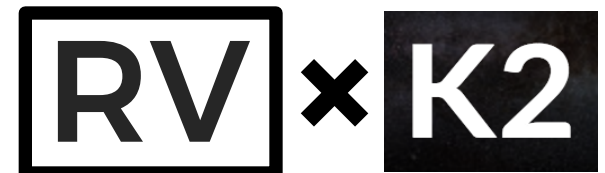
HIP 43418	9.3	K0 V
HIP 42783	10.1	K7 V

**simultaneous  
RV+photometry  
asteroseismology**

**granulation signal**

$$A_{vel} \propto L$$

Kjeldson & Bedding 2011





# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

---

HD 76445	7.6	G5 IV
HIP 44072	9.3	M0 V
<b>HD 76780</b>	<b>7.6</b>	<b>G5 V</b>
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

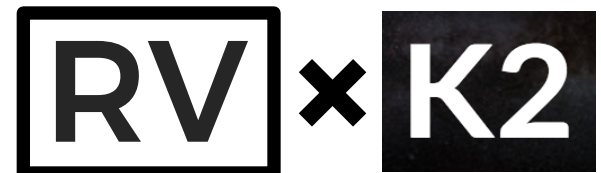
*Solar Analog*

- **asteroseismology**
- **(super)-granulation?**

## K2 30-min Cadence

---

HIP 43418	9.3	K0 V
HIP 42783	10.1	K7 V



# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

---

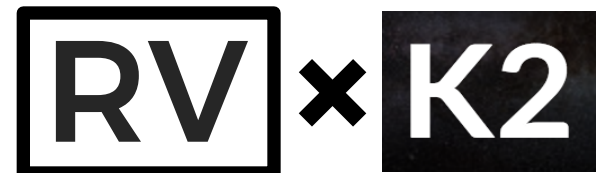
HD 76445	7.6	G5 IV
<b>HIP 44072</b>	<b>9.3</b>	<b>M0 V</b>
HD 76780	7.6	G5 V
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

**M and K dwarf  
activity on short  
time scales and  
over 80 days**

## K2 30-min Cadence

---

<b>HIP 43418</b>	<b>9.3</b>	<b>K0 V</b>
<b>HIP 42783</b>	<b>10.1</b>	<b>K7 V</b>



# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

---

HD 76445	7.6	G5 IV
HIP 44072	9.3	M0 V
HD 76780	7.6	G5 V
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

## K2 30-min Cadence

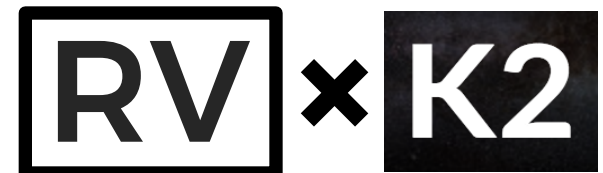
---

HIP 43418	9.3	K0 V
HIP 42783	10.1	K7 V

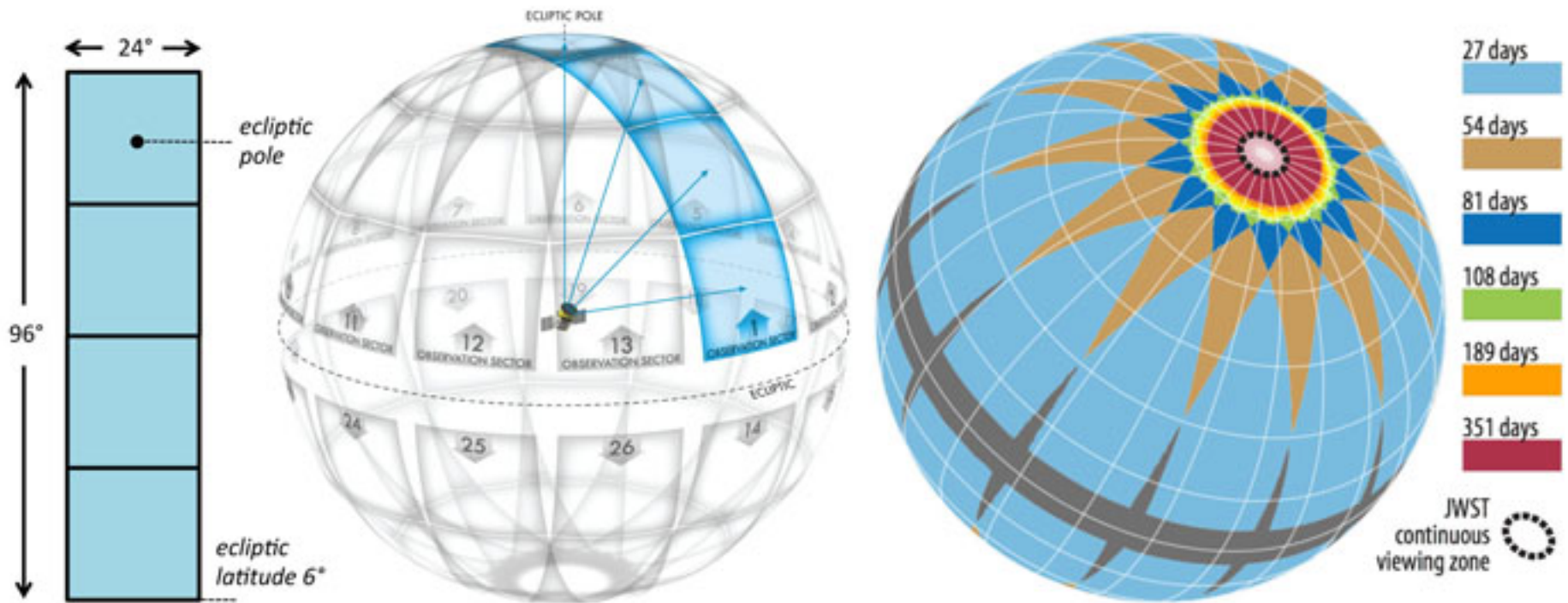
Keck/HIRES  
minute - hours

APF + IRTF/iSHELL  
M/K dwarfs  
~nightly in Dec. – Jan.

SONG, MINERVA, PARAS  
~nightly on others



# A Trial Run for simultaneous RVs in the **TESS** era



Thank you & let's  
**Collaborate!**

**RV** × **K2** .com

**Team Members:** Jason Wright, John Johnson, Fabienne Bastien, Heather Cegla, Jacob Luhn, Jennifer Burt, Elisabeth Newton, Jason Eastman, Johanna Teske, Peter Plavchan, Andrew Vanderburg, Courtney Dressing, Paul Robertson, Abhijit Chakraborty, Frank Grundahl, Brad Holden, Howard Isaacson, Andrew Howard, and Paul Butler

# C16: Dec 7, 2017 – Feb 25, 2018

## K2 1-min Cadence

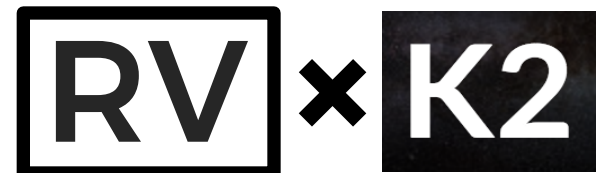
---

HD 76445	7.6	G5 IV
HIP 44072	9.3	M0 V
HD 76780	7.6	G5 V
HD 75784	7.9	K3 IV
HD 73534	8.2	G5 IV

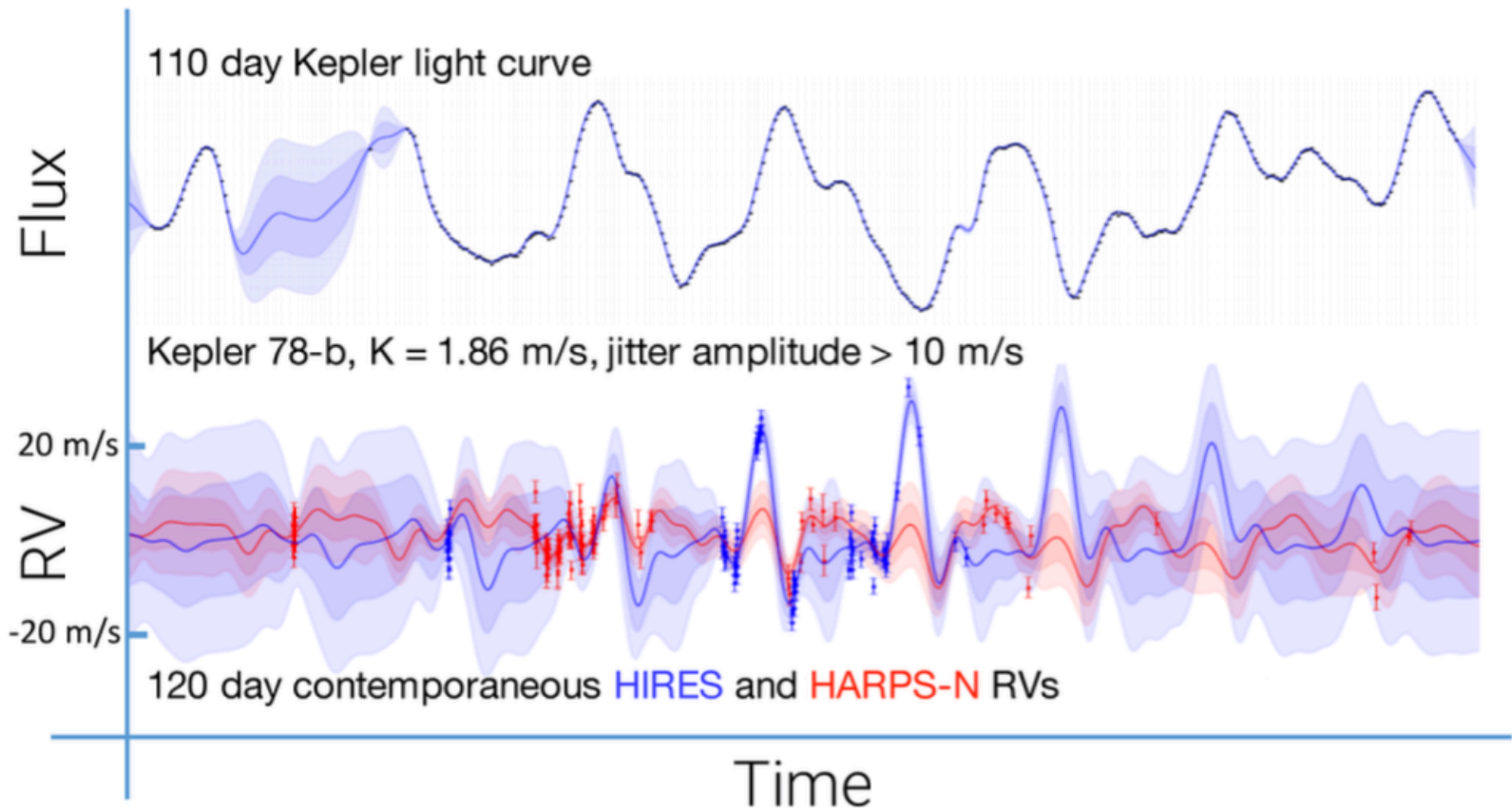
## K2 30-min Cadence

---

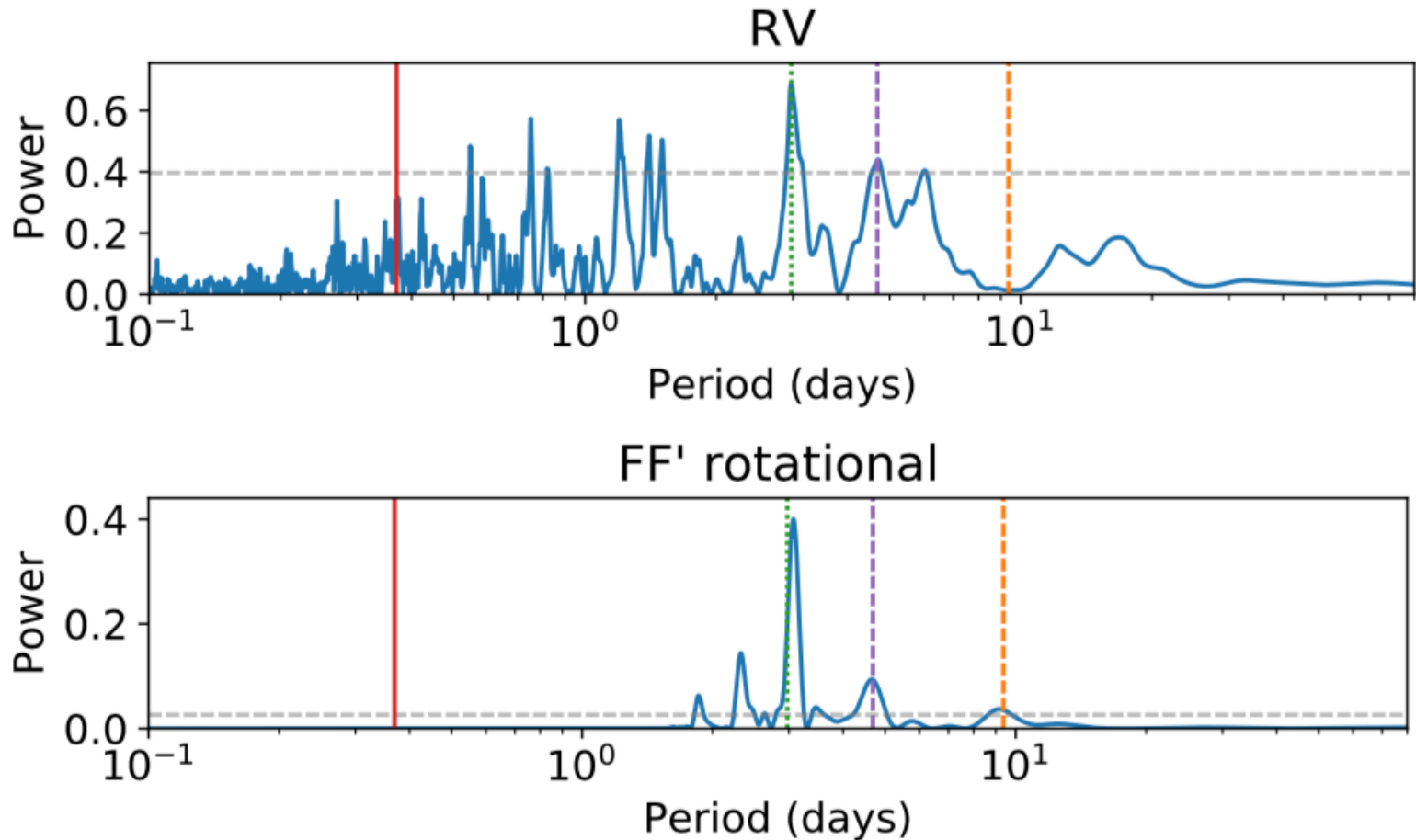
HIP 43418	9.3	K0 V
HIP 42783	10.1	K7 V



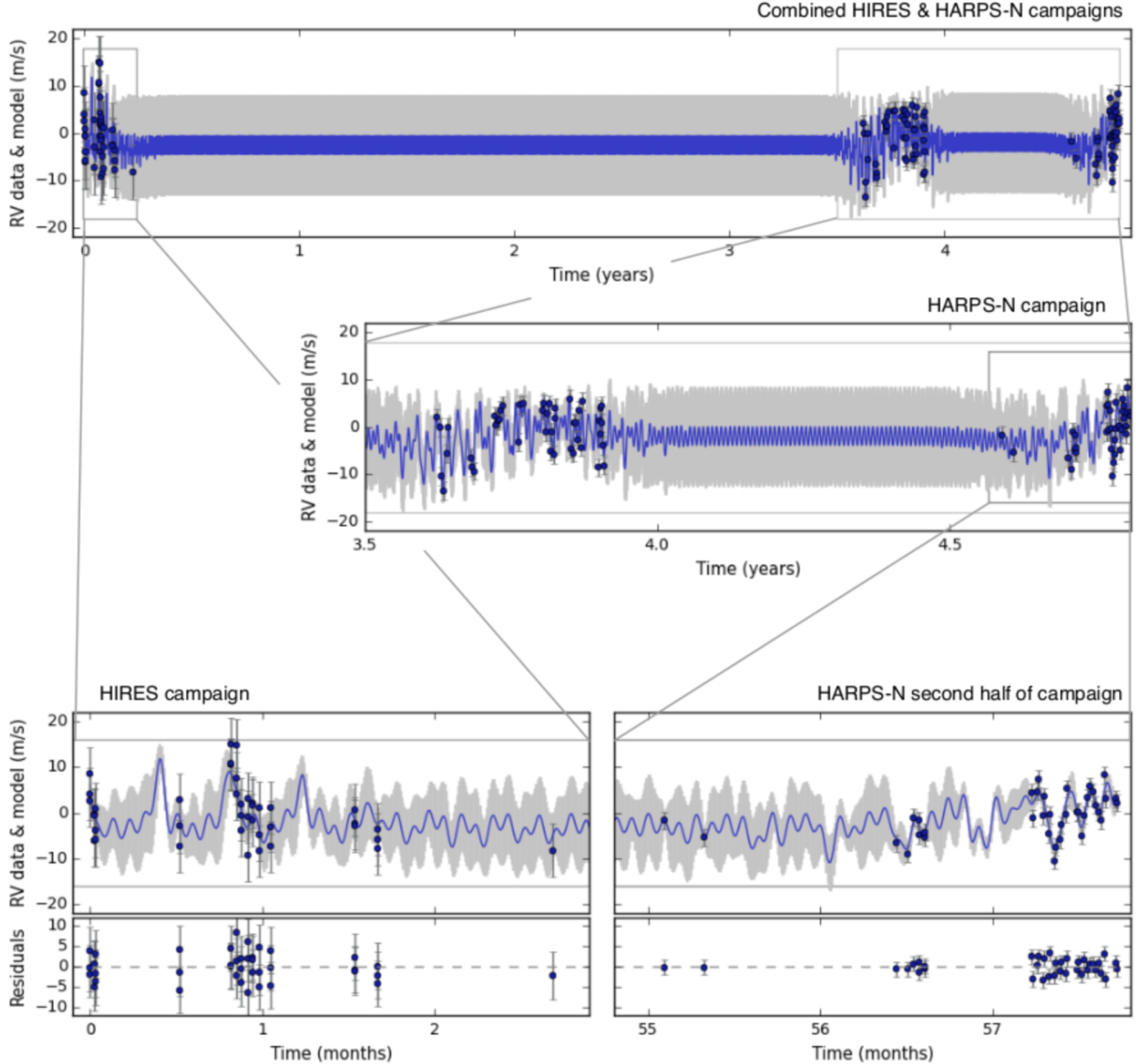
# Use photometry to **inform** GP fit to RVs.



**The most prominent RV signal is a rotation harmonic, which did not show up in any spectroscopic indicators.**



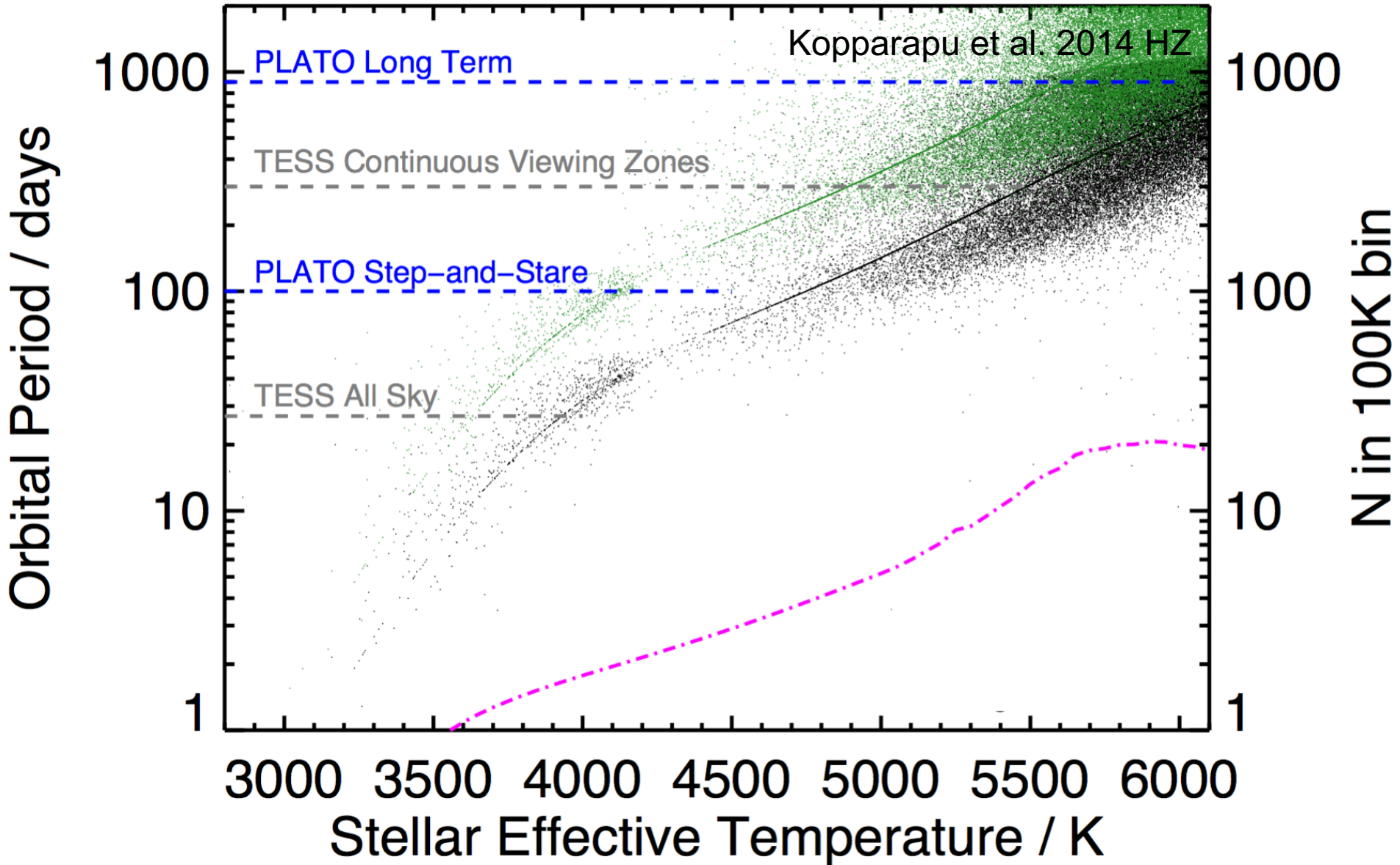




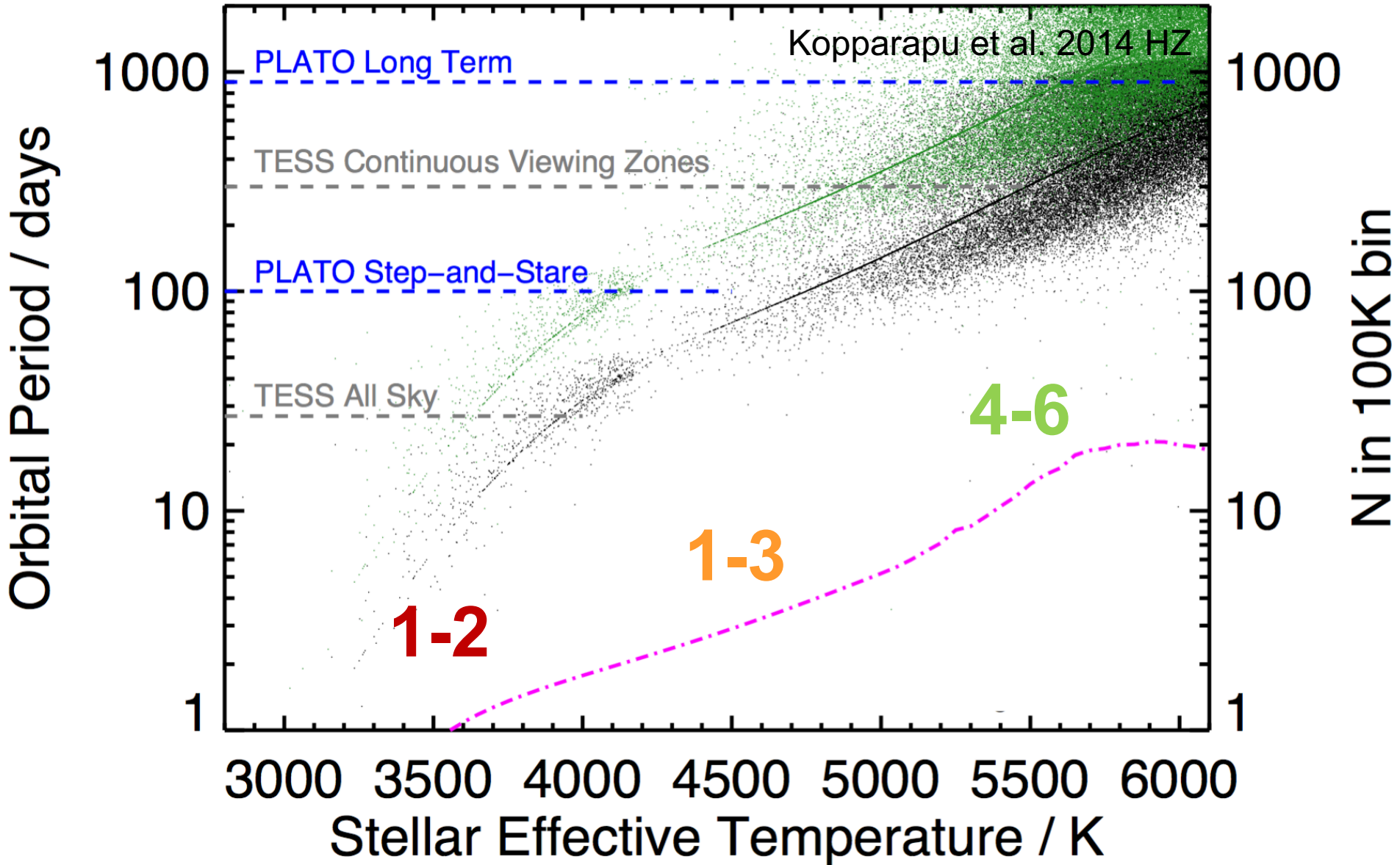
López-Morales et al. 2016

Kepler 21-b

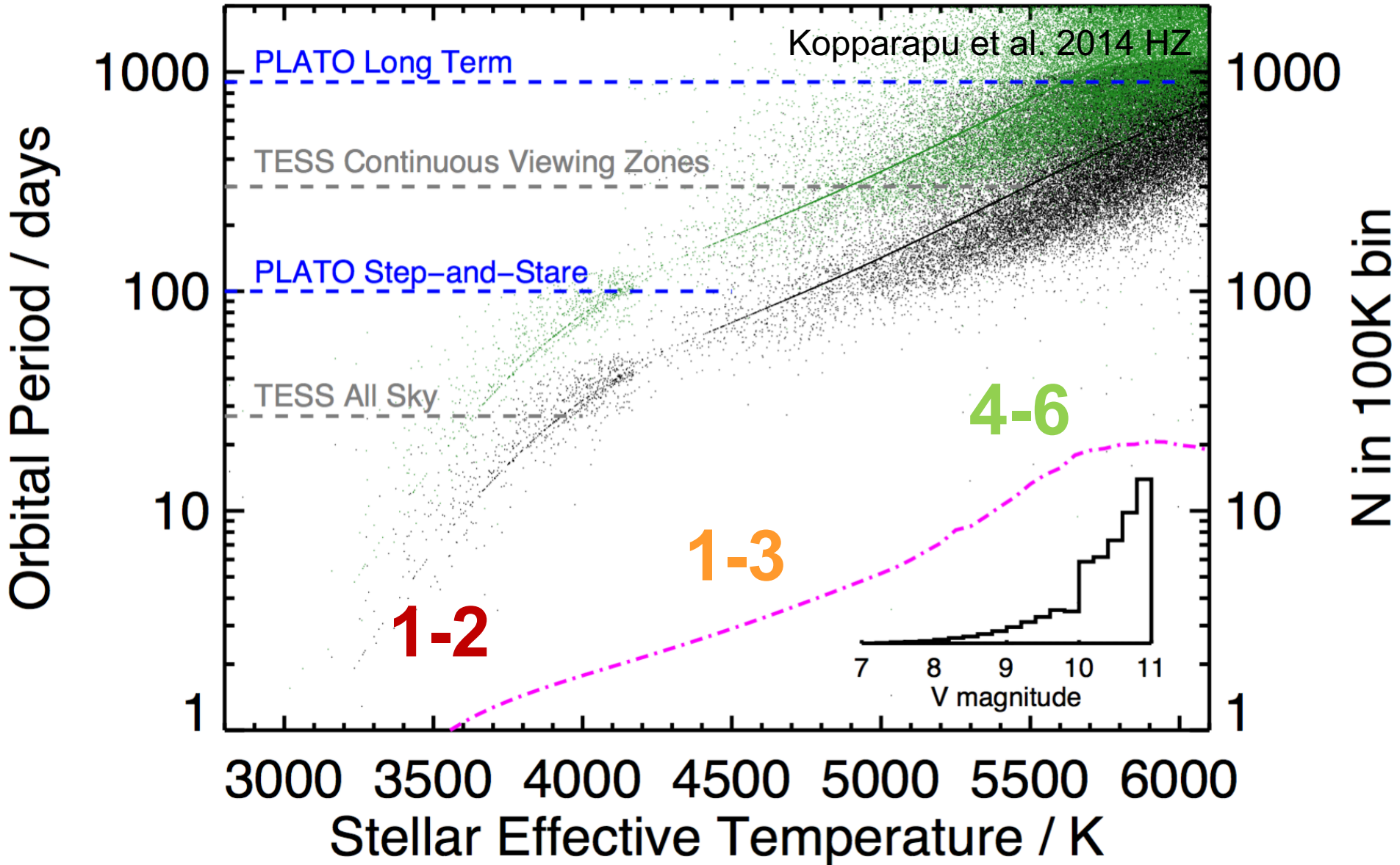
# Find the **Nearest** HZ Planets.



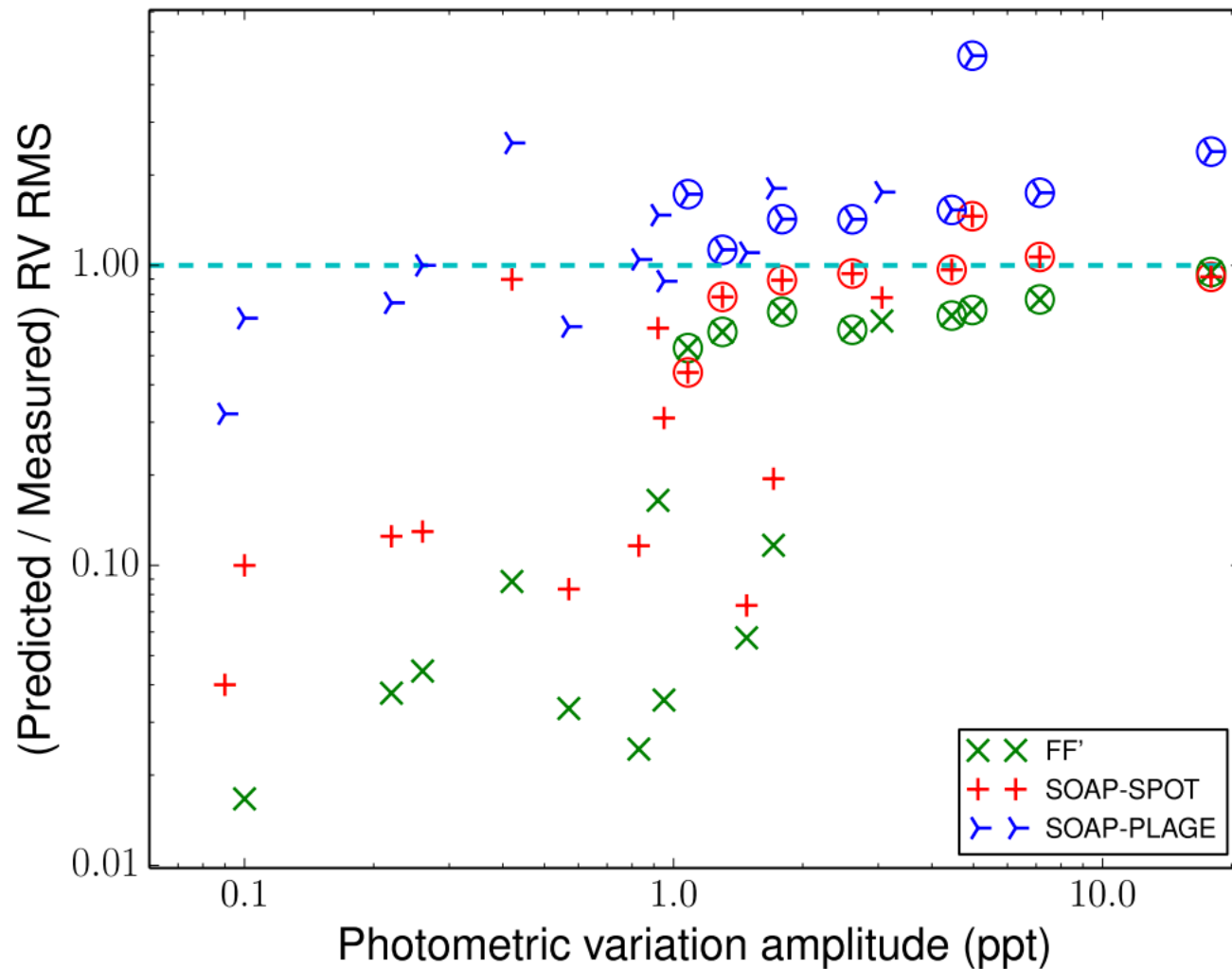
# Find the **Nearest** HZ Planets.



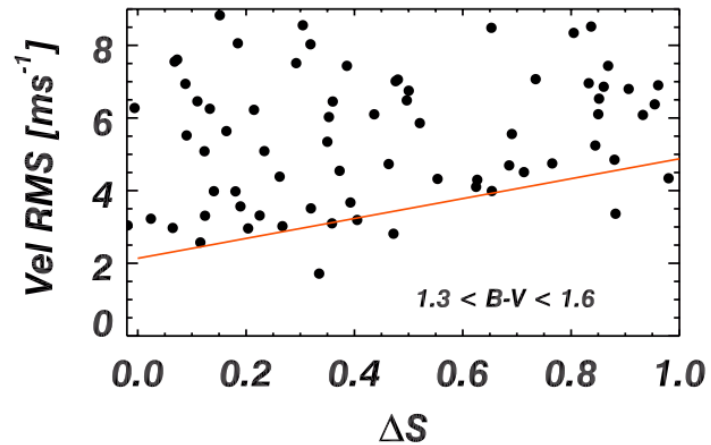
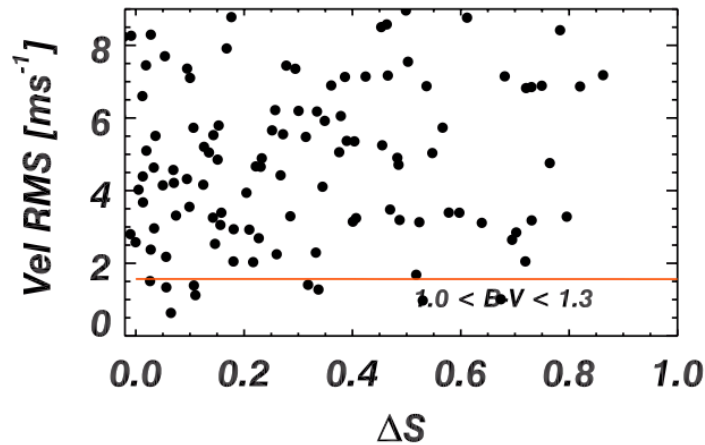
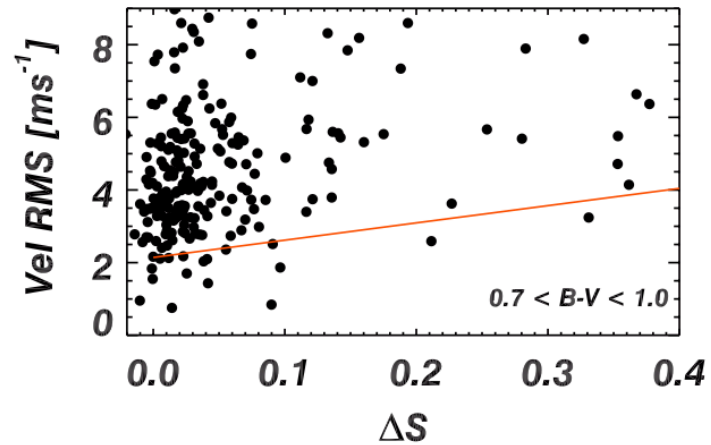
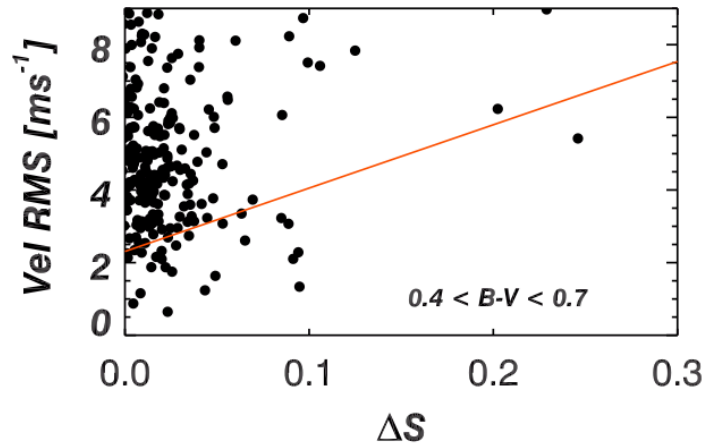
# Find the **Nearest** HZ Planets.



# Simultaneous HARPS RVs with K2 Campaign 7 & 8



# Ca H&K measurements have **limited power** in predicting stellar activity level.



Isaacson & Fischer 2010  
also: Wright et al. 2004, Lovis 2011