

# Measuring stellar ages from light curves

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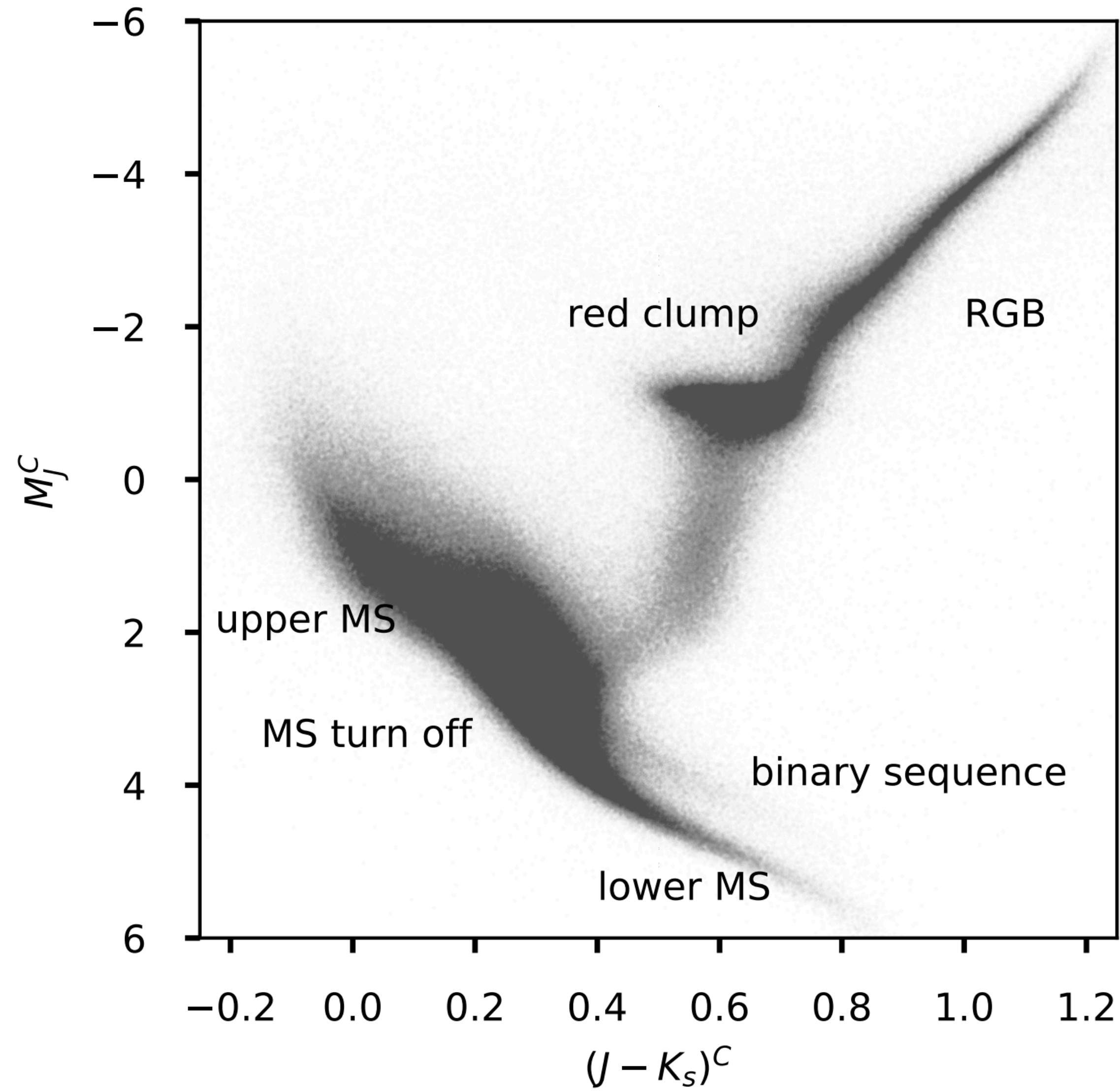
**Ruth Angus**

**Assistant Curator & Professor, Department of Astrophysics, American Museum of Natural History**

**Associate Research Scientist, Center for Computational Astrophysics, Flatiron Institute**

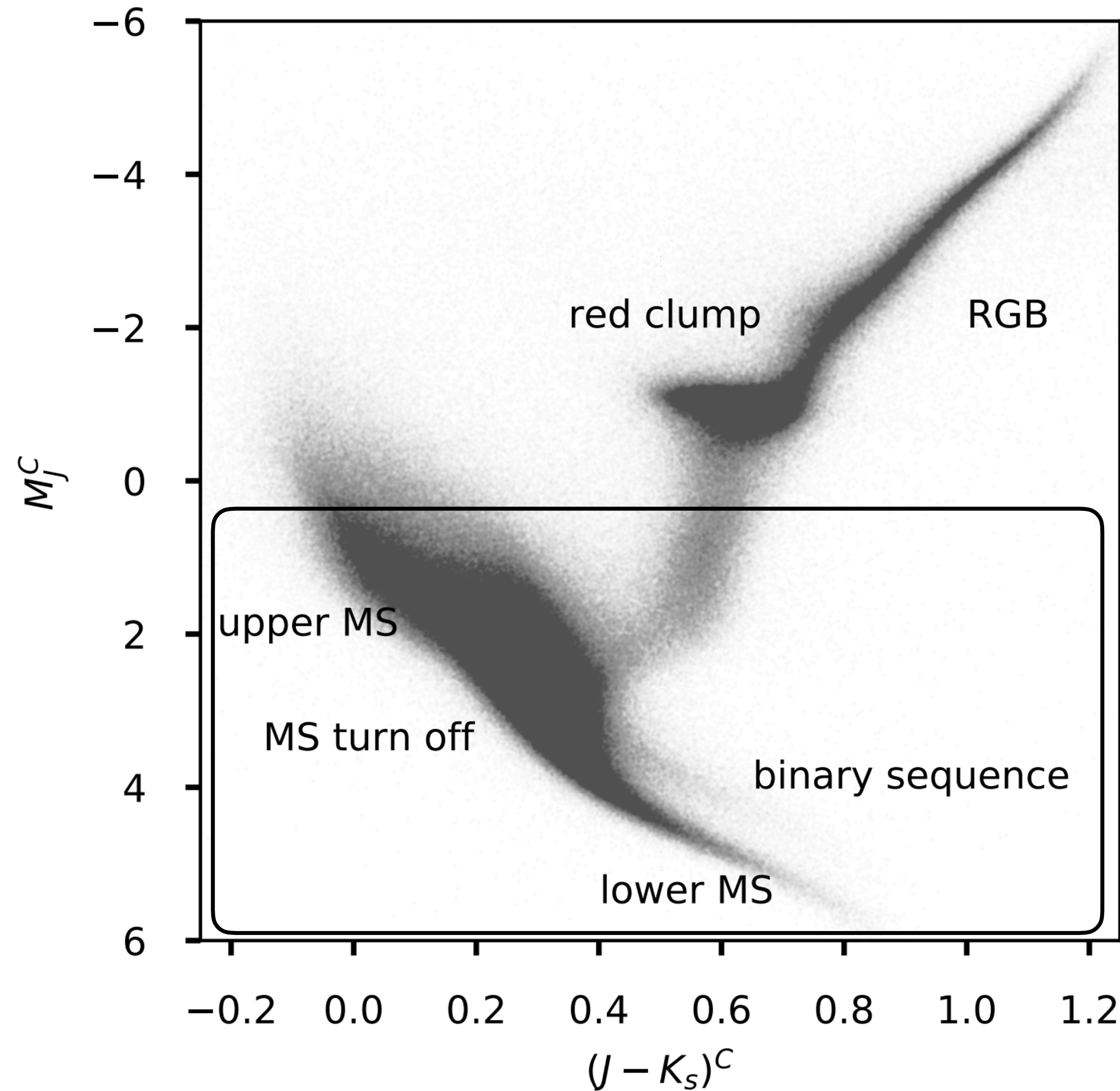
**Assistant Adjunct Professor, Department of Astronomy, Columbia University**

# The Gaia color-magnitude diagram



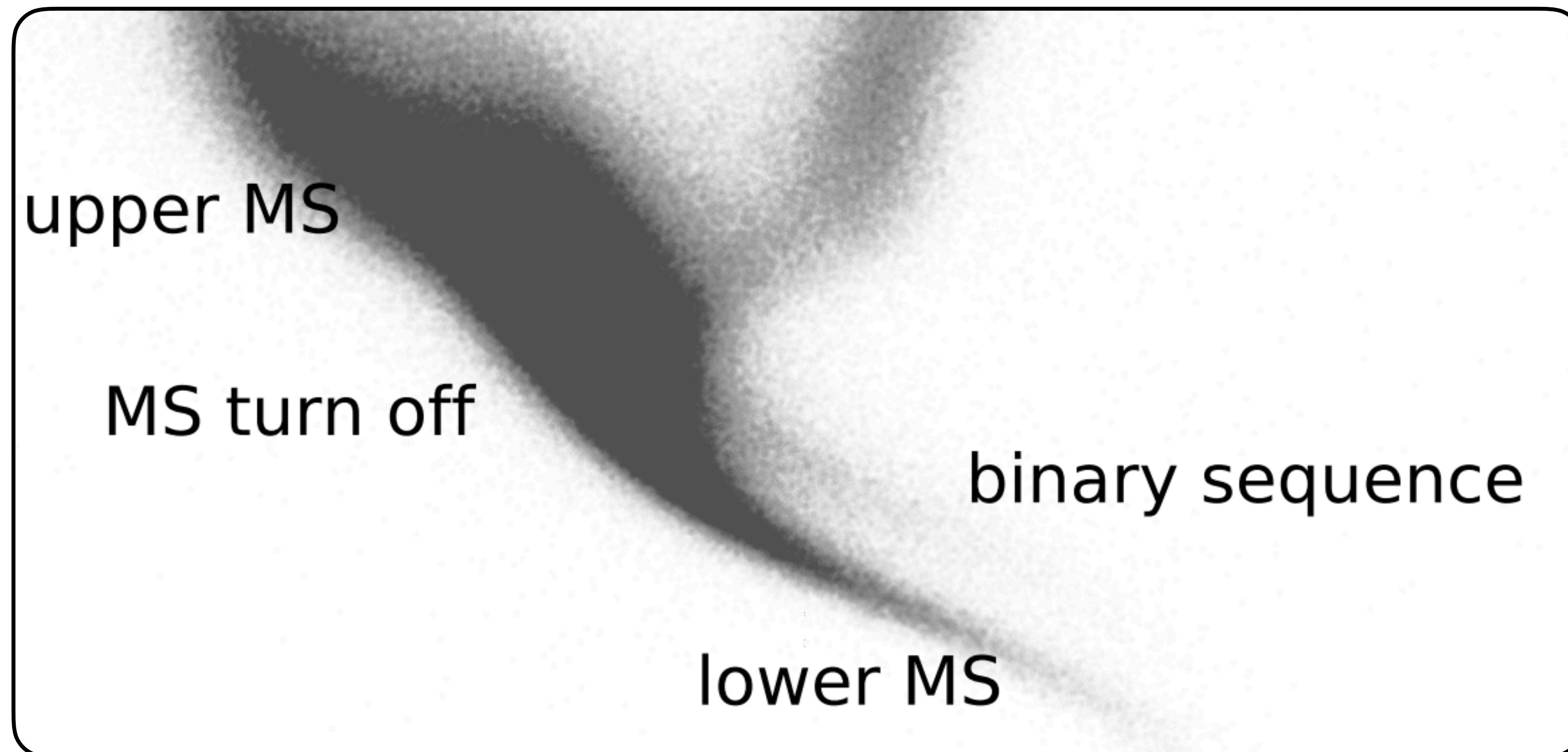
Anderson et al. (2017)  
ArXiv: 1706.05055

# The Gaia color-magnitude diagram

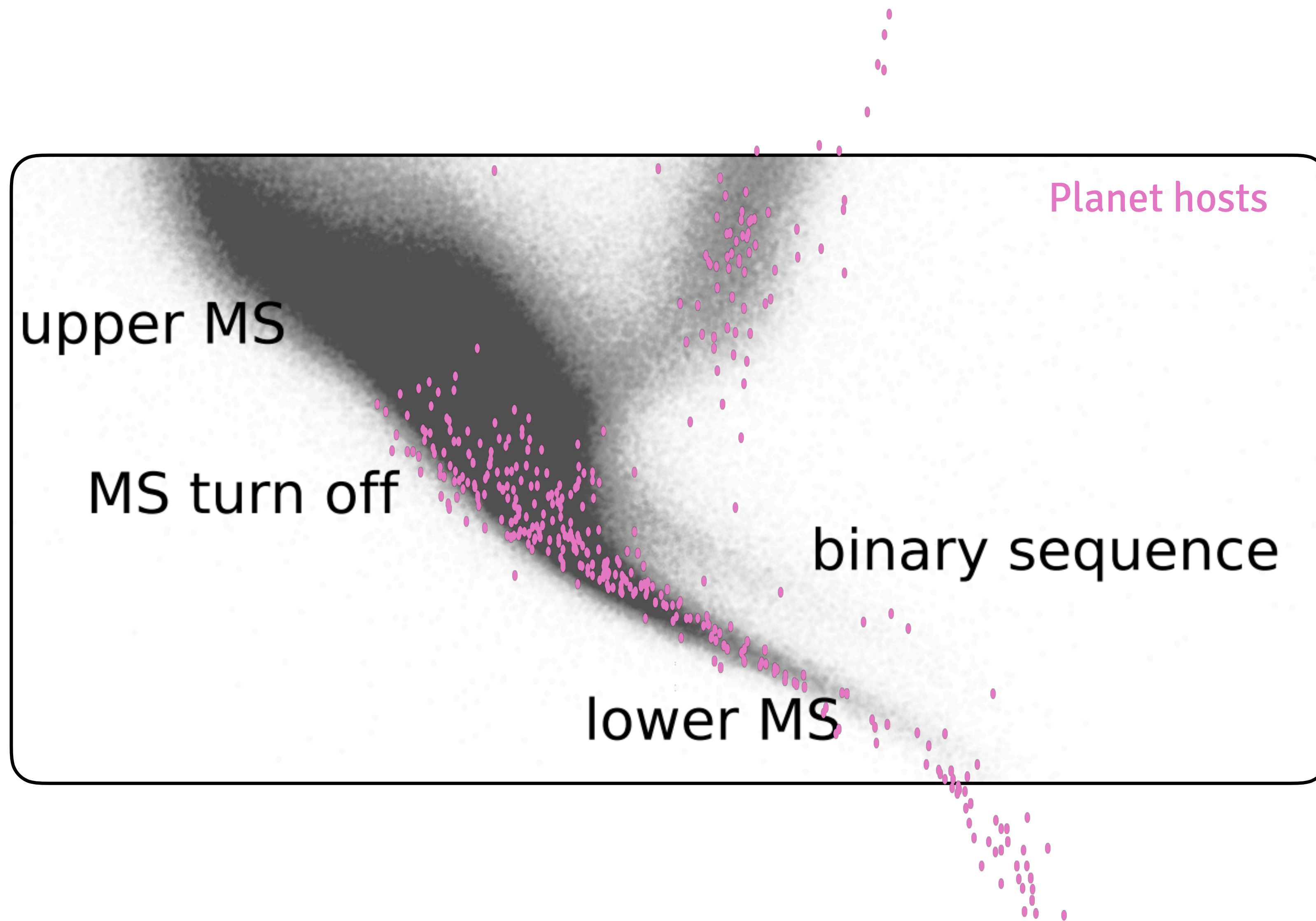


Anderson et al. (2017)  
ArXiv: 1706.05055

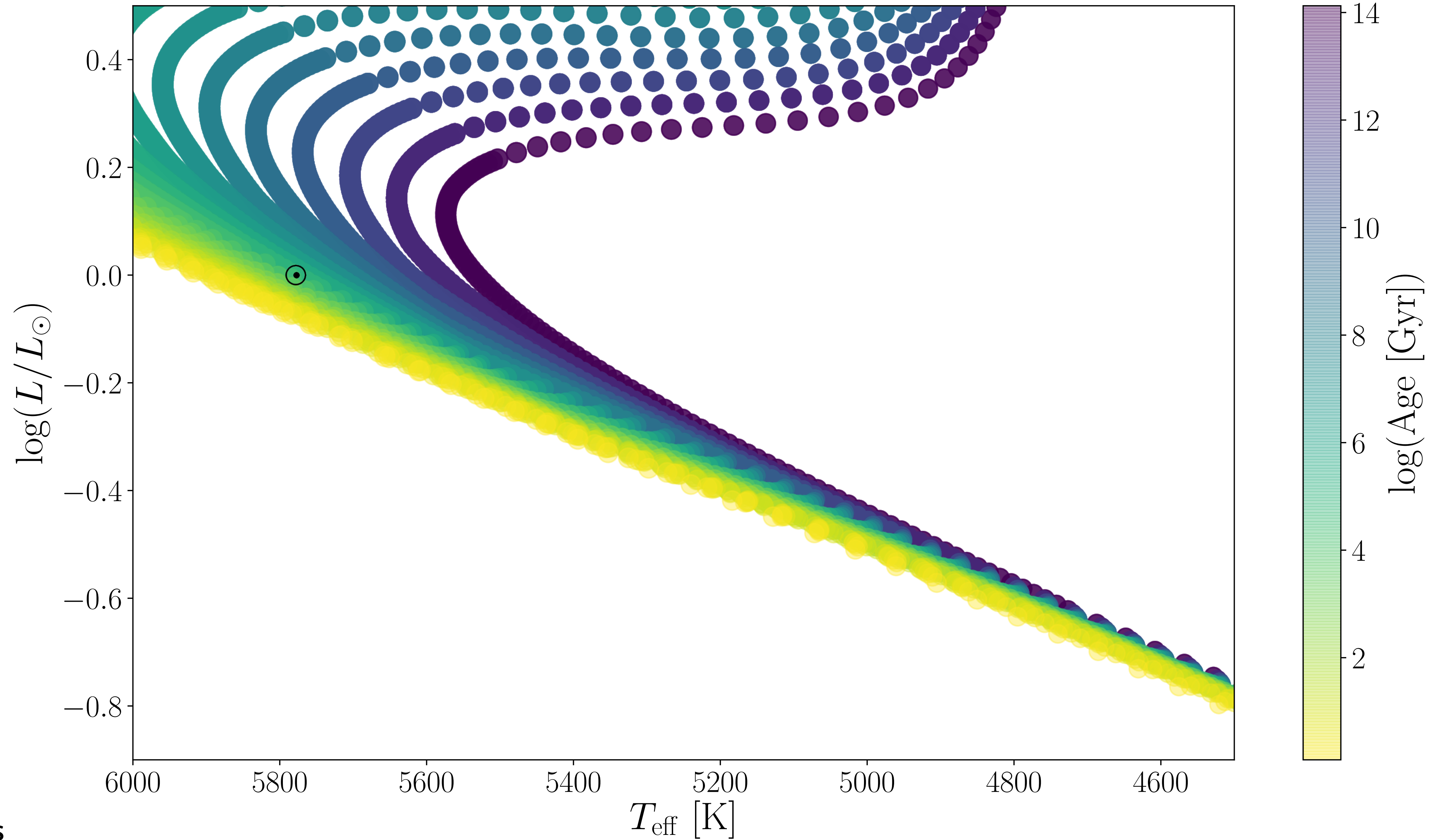
# The Gaia color-magnitude diagram



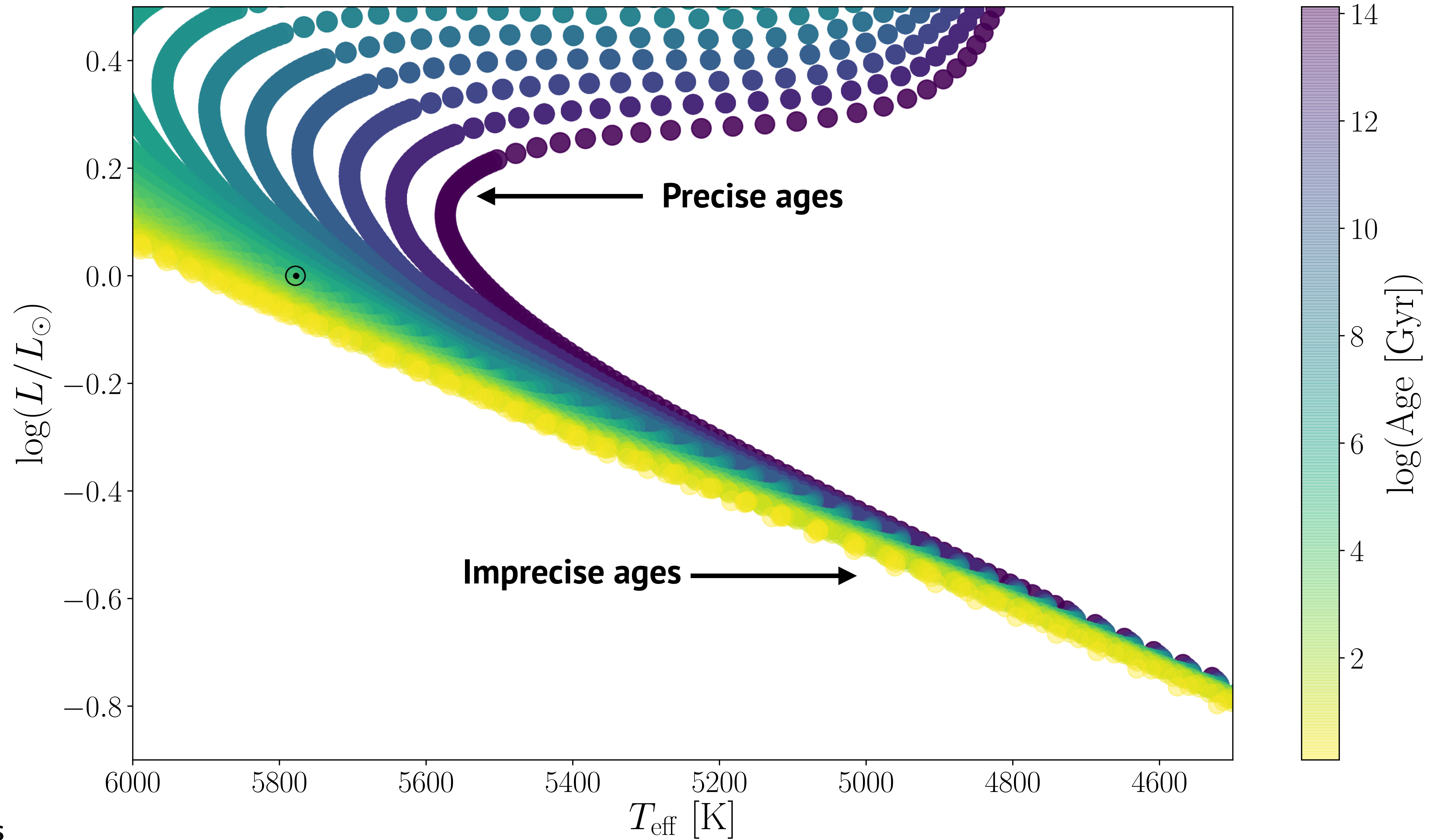
# The Gaia color-magnitude diagram



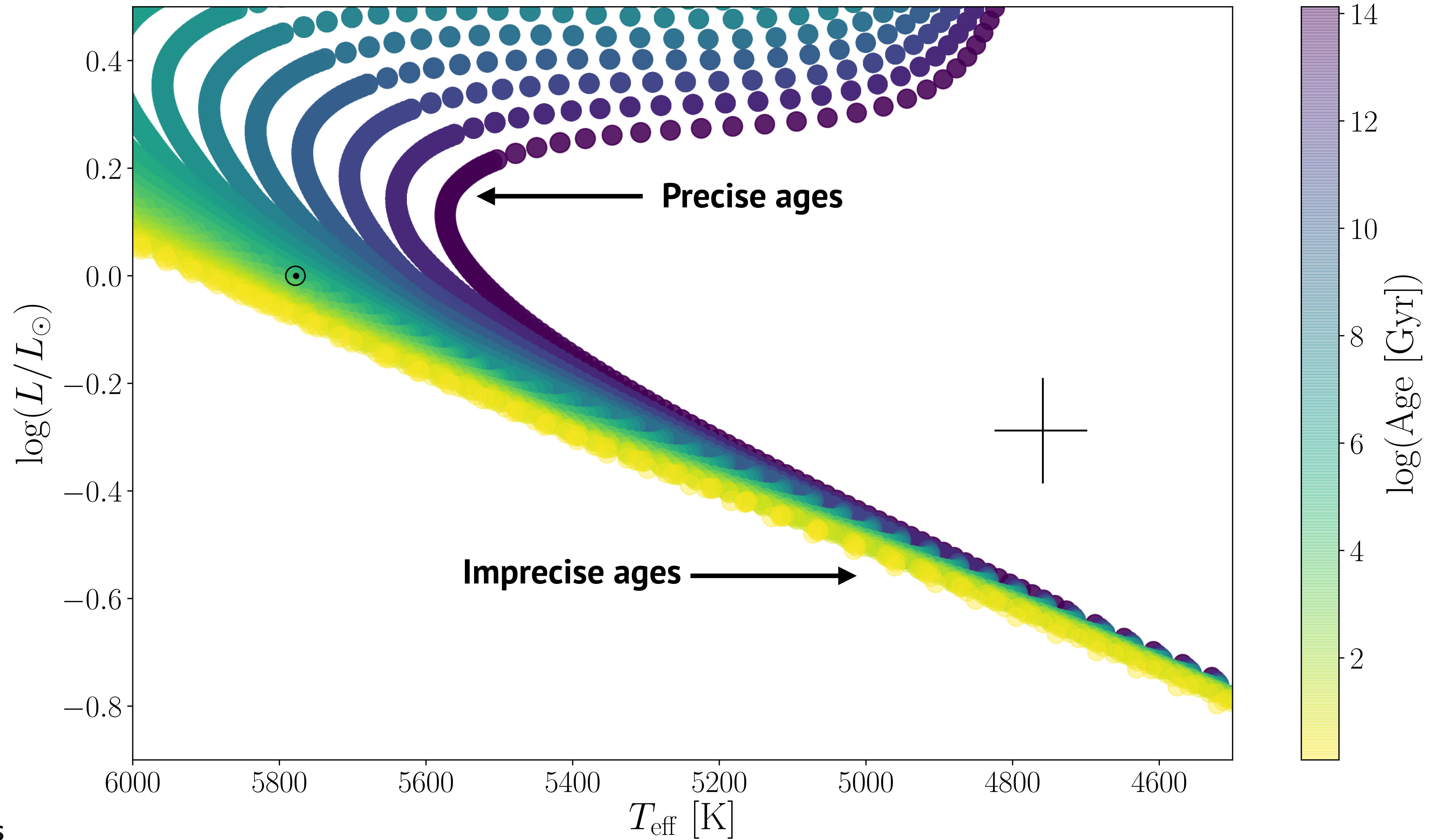
# Ages from isochrone fitting



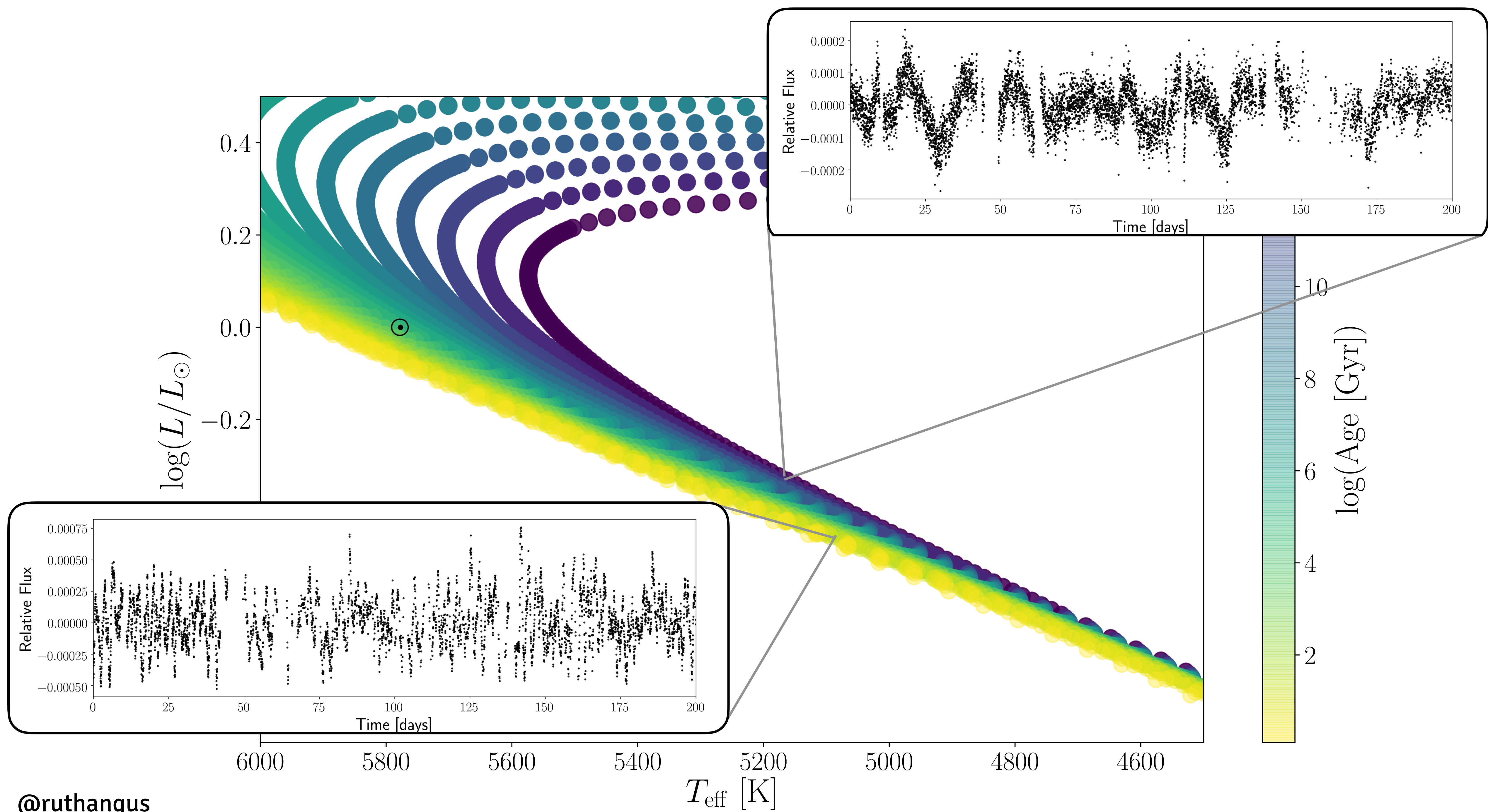
# Ages from isochrone fitting



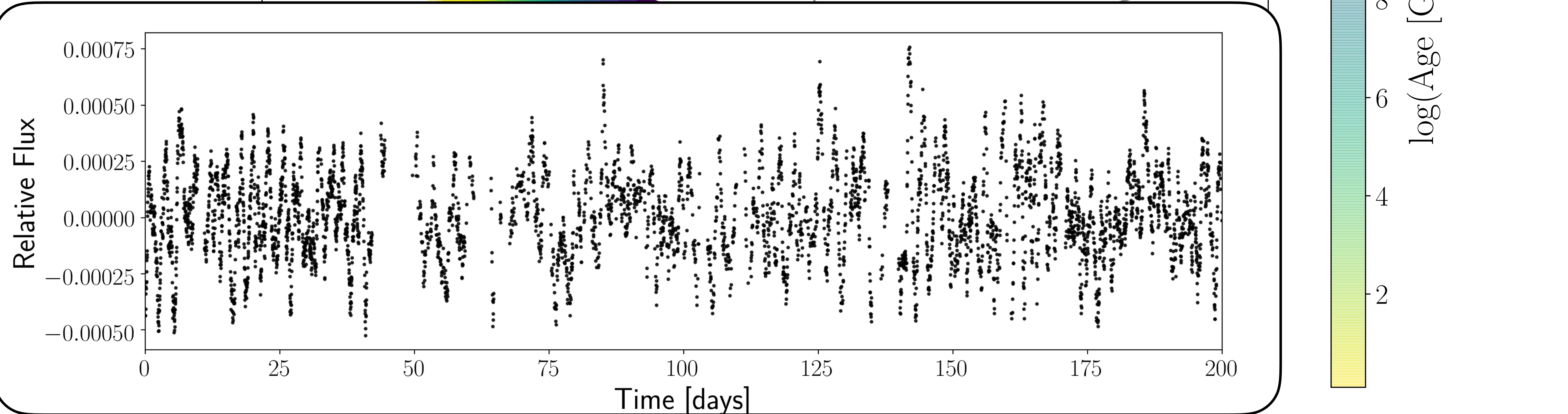
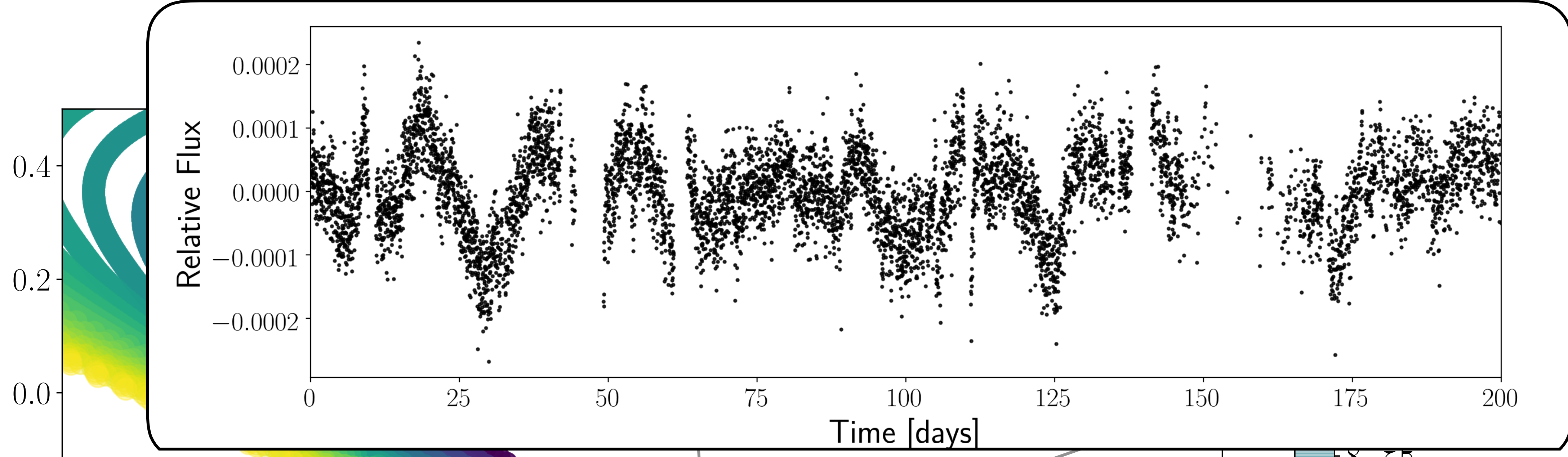
# Ages from isochrone fitting





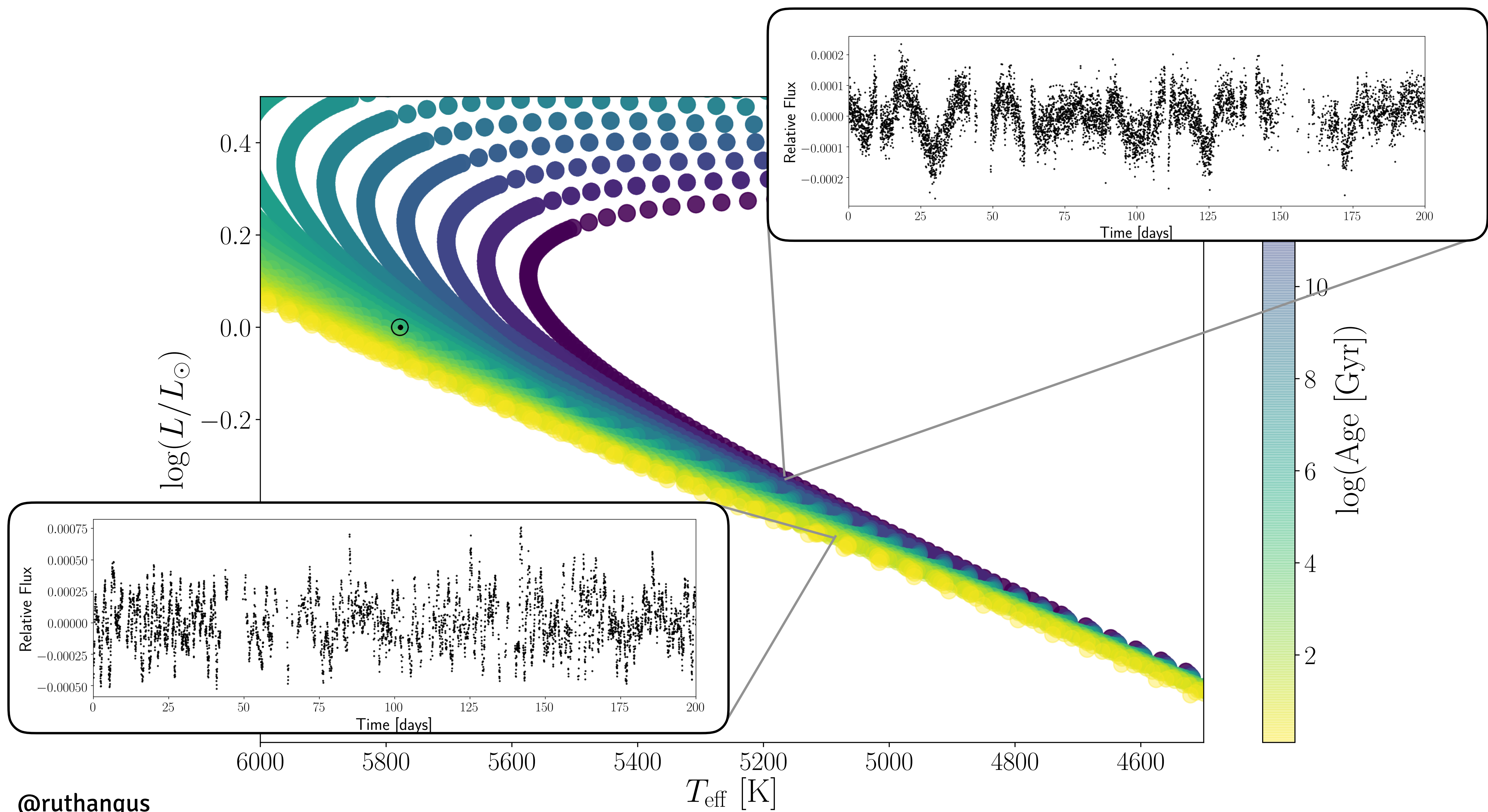


⊙

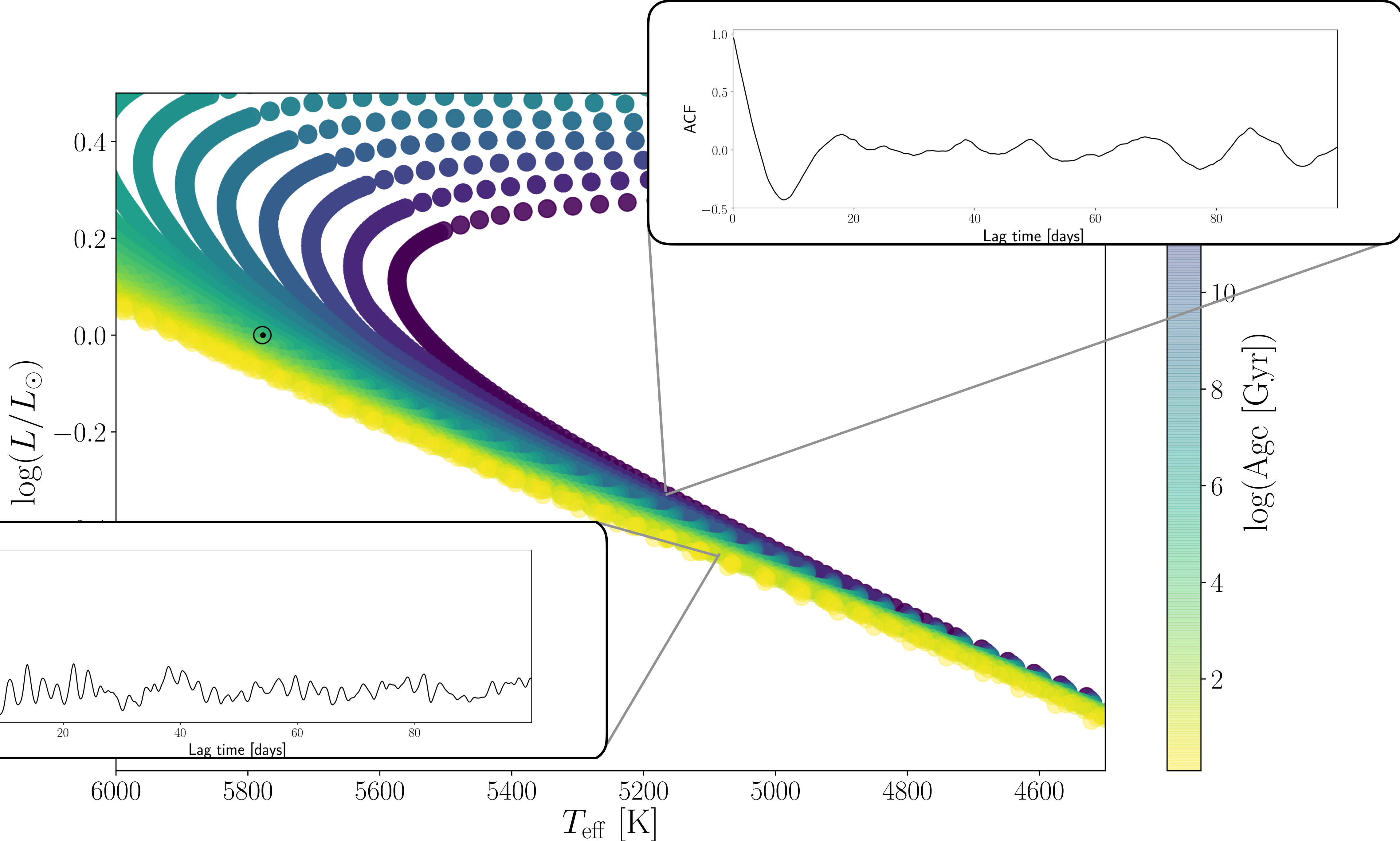


$T_{\text{eff}}$  [K]

@ruthangus

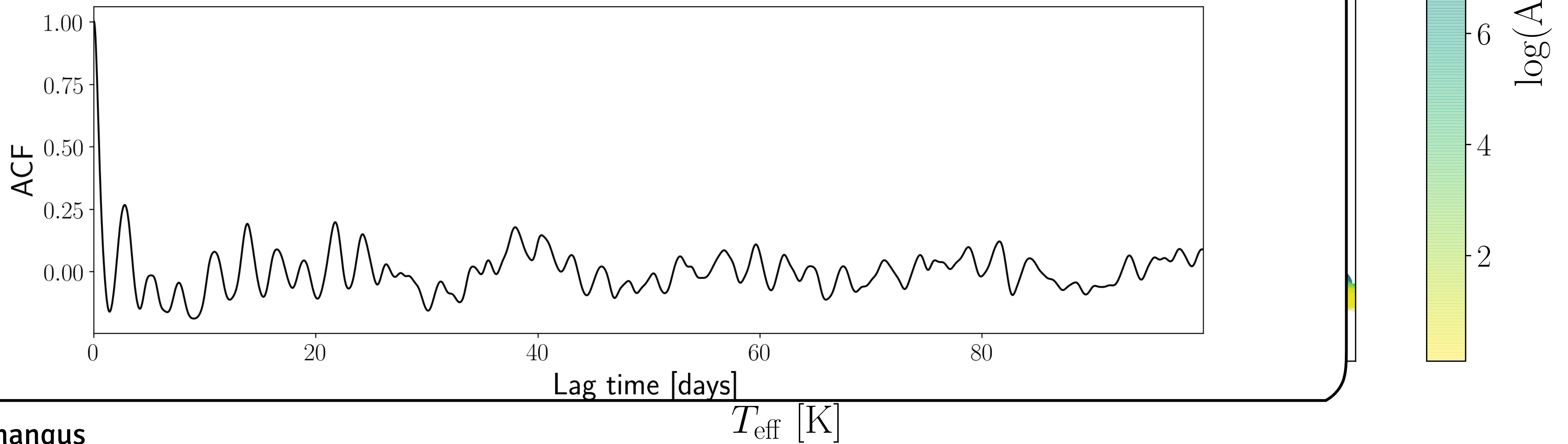
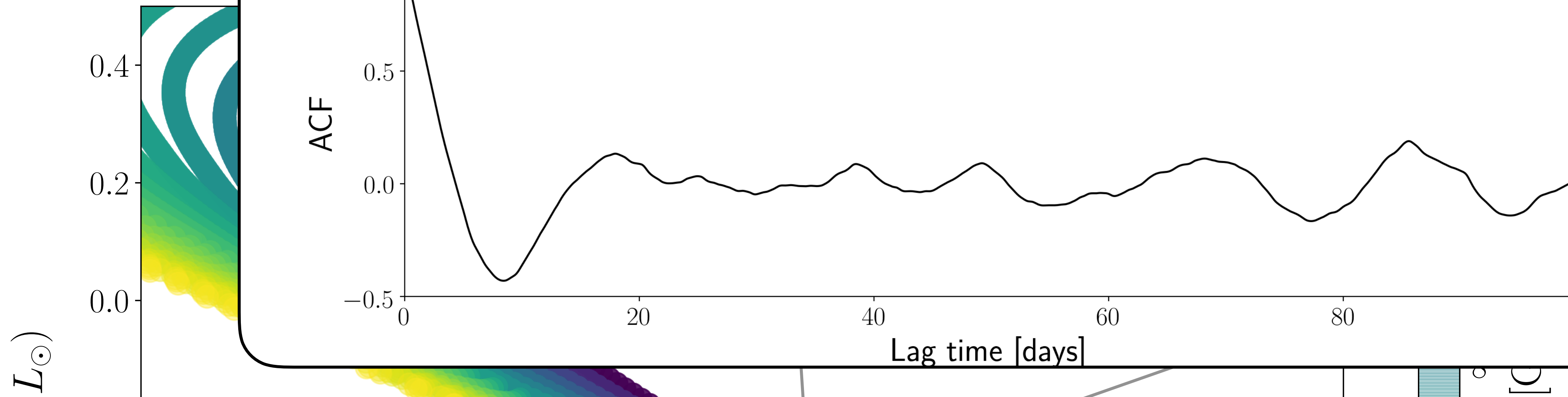


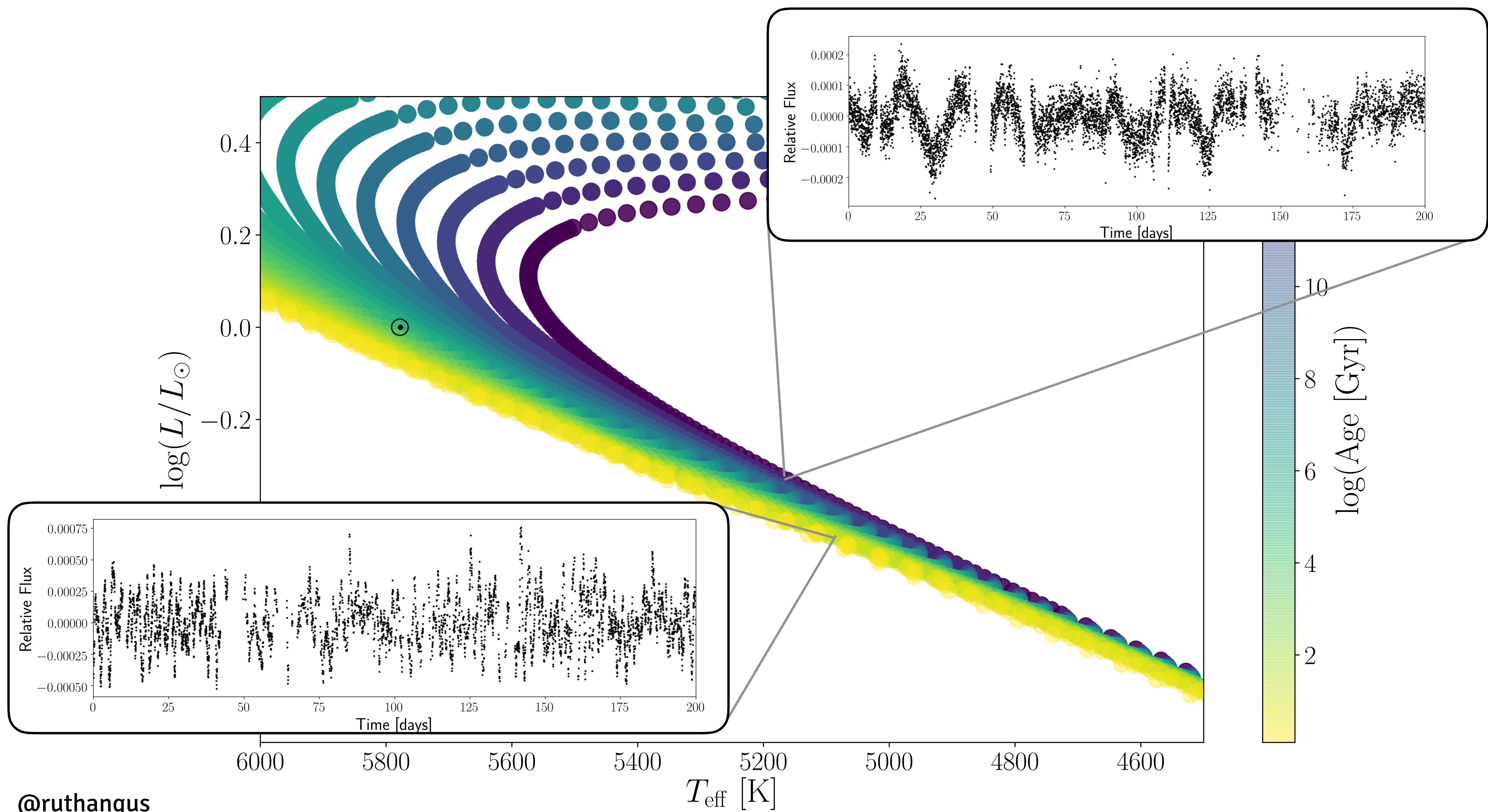
@ruthangus



@ruthangus

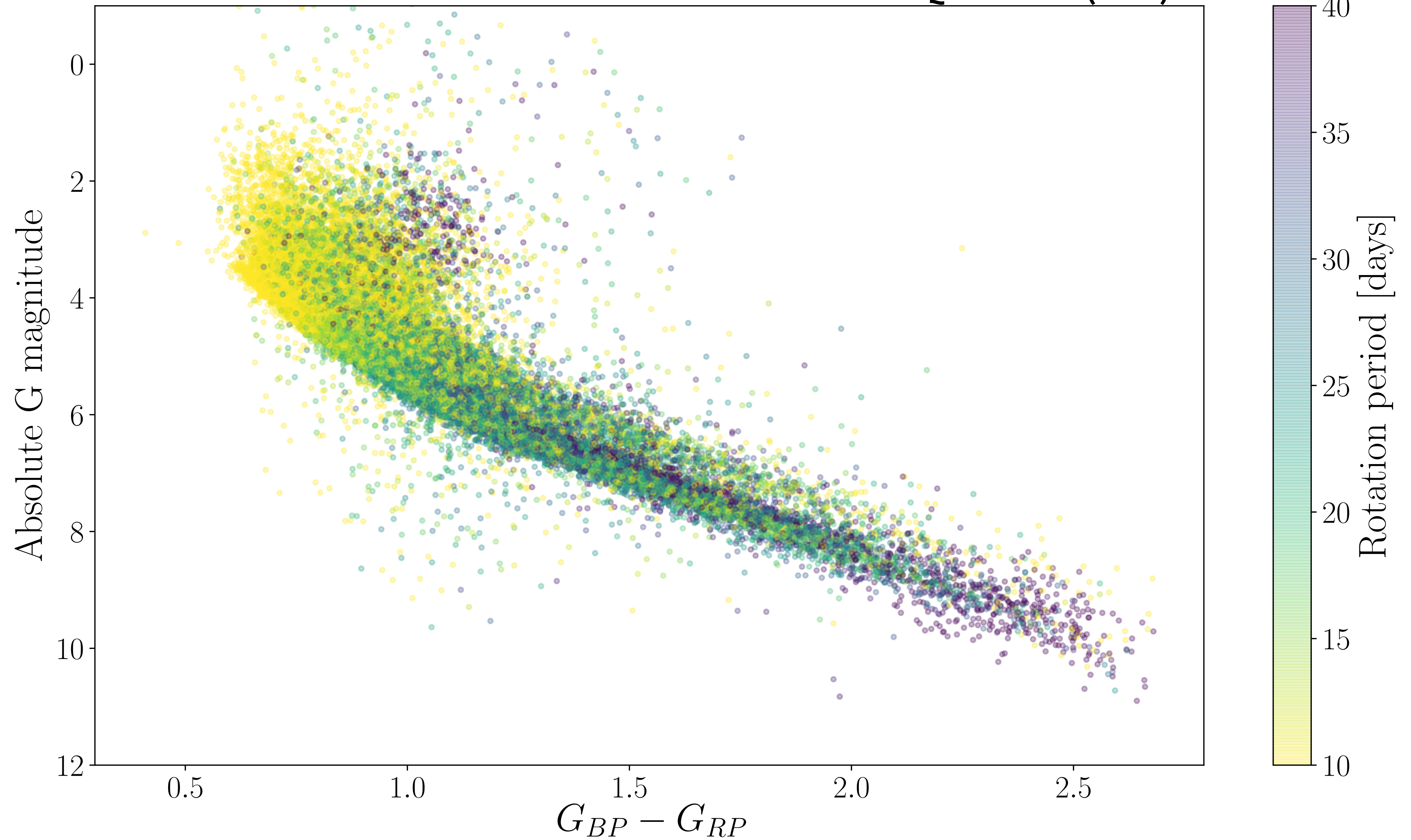
# The light curve Cannon (Ness et al., 2018)





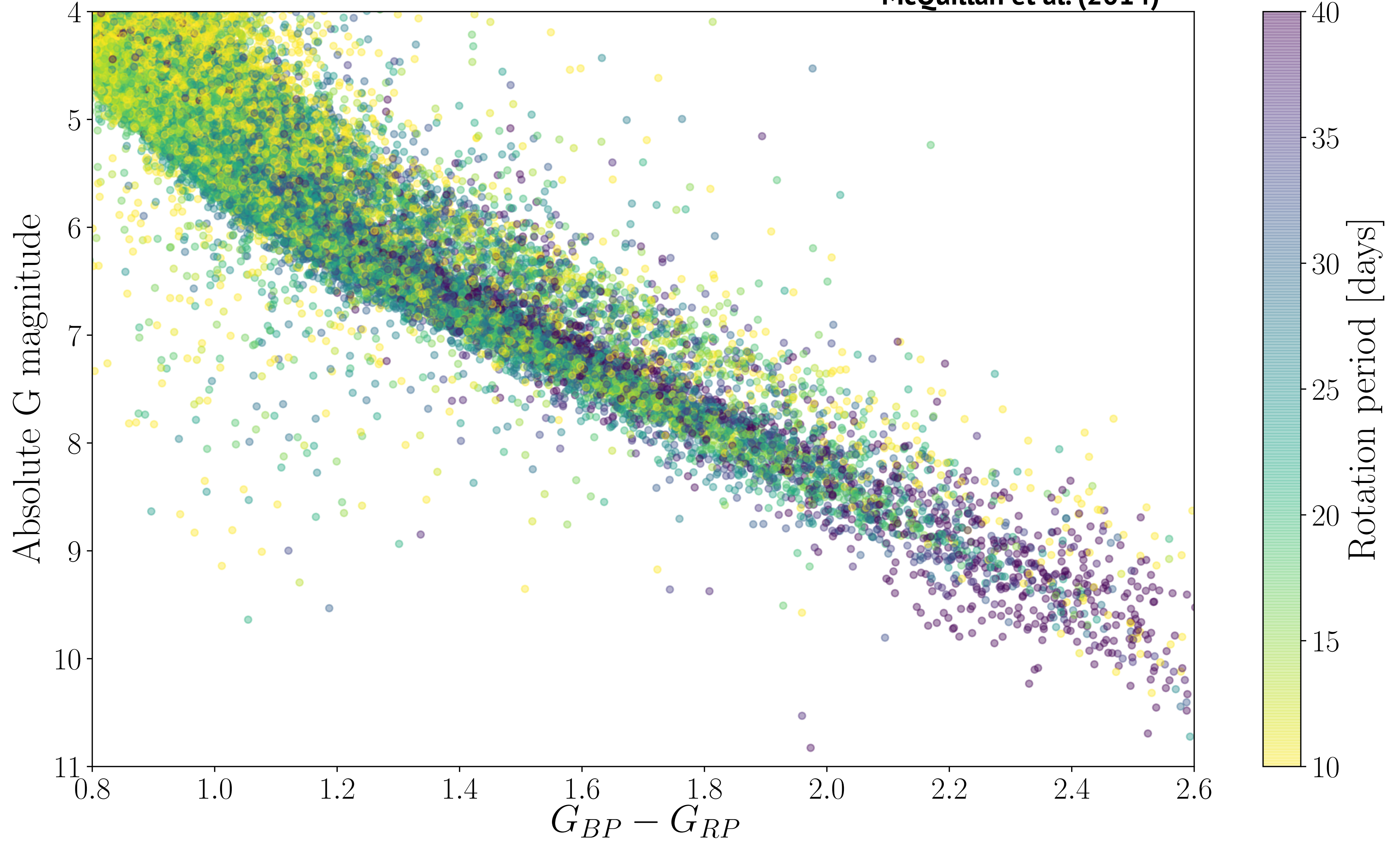
# Stellar rotation on the CMD

McQuillan et al. (2014)



# Stellar rotation on the CMD

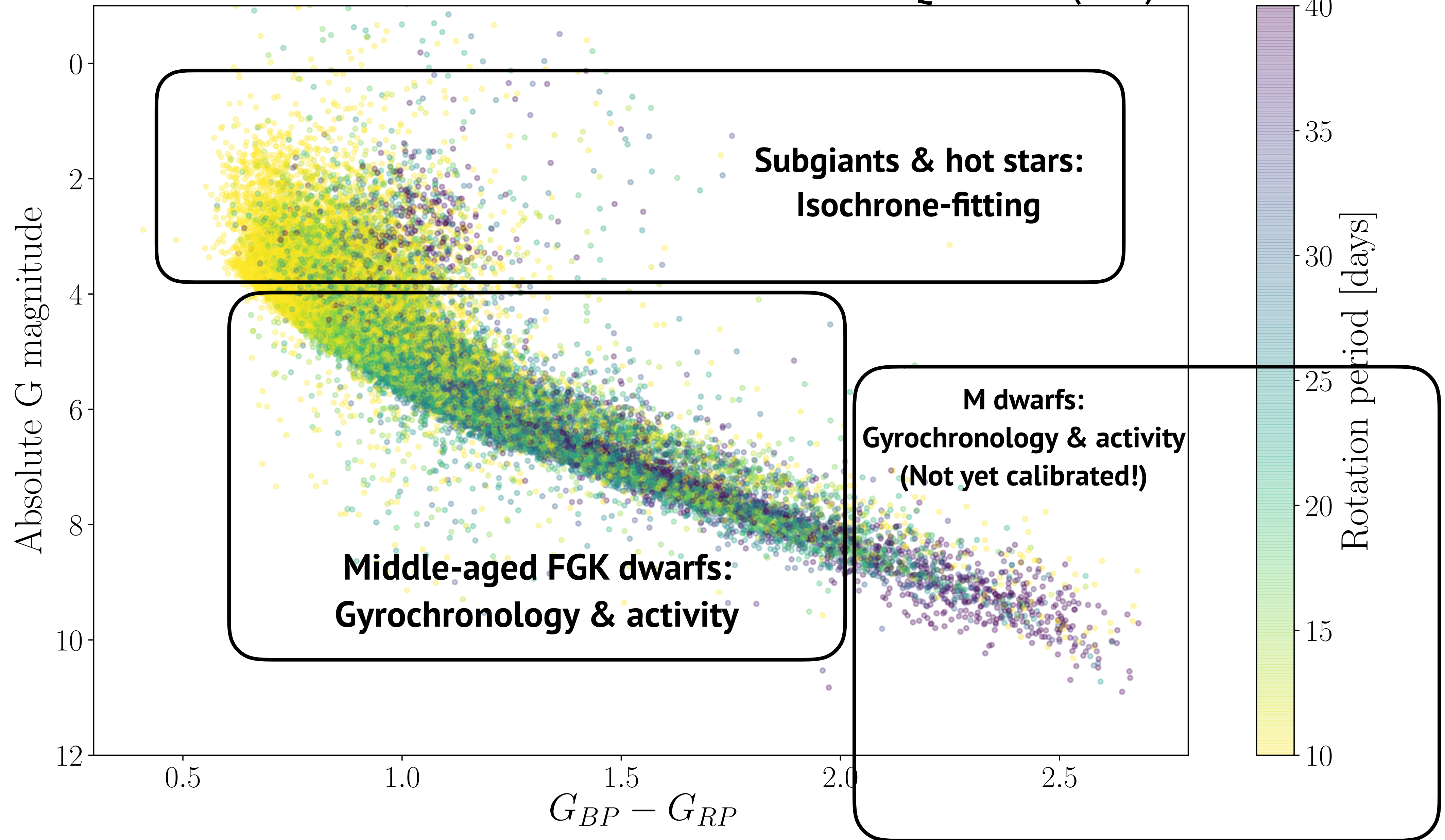
McQuillan et al. (2014)





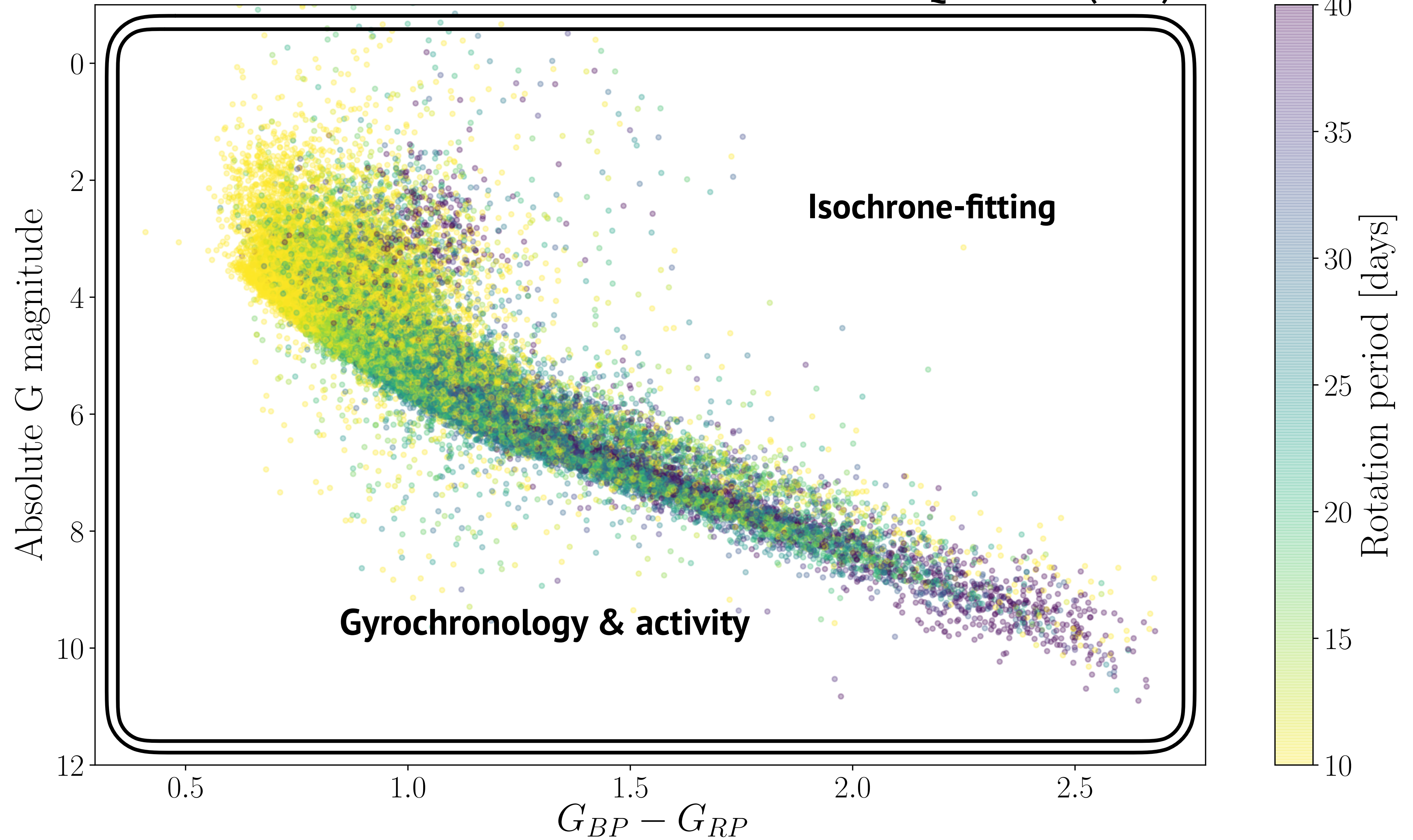
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# stardate

[stardate.readthedocs.io](http://stardate.readthedocs.io)  
[github/ruthangus/stardate](https://github.com/ruthangus/stardate)

- 1 Combines **multiple** age indicators/dating methods

# stardate

[stardate.readthedocs.io](http://stardate.readthedocs.io)  
[github/ruthangus/stardate](https://github.com/ruthangus/stardate)

2

Selects **best dating method** in each region of parameter space

# stardate

[stardate.readthedocs.io](https://stardate.readthedocs.io)  
[github/ruthangus/stardate](https://github.com/ruthangus/stardate)

**3** Rotation period is a **function of all stellar parameters**

# stardate

[stardate.readthedocs.io](http://stardate.readthedocs.io)  
[github/ruthangus/stardate](https://github.com/ruthangus/stardate)

**4** Empirical equivalent of isochrones/tracks with rotation

# stardate

[stardate.readthedocs.io](https://stardate.readthedocs.io)  
[github/ruthangus/stardate](https://github.com/ruthangus/stardate)

**5** Built on top of *isochrones* ([github.com/timothydmorton/isochrones](https://github.com/timothydmorton/isochrones))

# stardate (Cross-submitted to AJ and JOSS)

Ruth Angus, Tim Morton, Dan Foreman-Mackey, Jen van Saders,  
Stephen Kane, Rocio Kiman, Jason Curtis, John Brewer, David Hogg

**stardate.readthedocs.io**  
**github/ruthangus/stardate**

Docs » stardate [View page source](#)

## stardate

*stardate* is a tool for measuring precise stellar ages. It combines isochrone fitting with gyrochronology (rotation-based age inference) to increase the precision of stellar ages on the main sequence. The best possible ages provided by *stardate* will be for stars with rotation periods, although ages can be predicted for stars without rotation periods too. If you don't have rotation periods for any of your stars, you might consider using [isochrones.py](#) as *stardate* is simply an extension to *isochrones* that incorporates gyrochronology. *stardate* reverts back to *isochrones* when no rotation period is provided.

In order to get started you can create a dictionary containing the observables you have for your star. These could be atmospheric parameters (like those shown in the example below for the Sun), or just photometric colors, like those from *2MASS*, *SDSS* or *Gaia*. If you have a parallax, asteroseismic parameters, or an idea of the maximum V-band extinction you should throw those in too. Set up the star object and `chronology.star.fit()` will run Markov Chain Monte Carlo (using *emcee*) in order to infer a Bayesian age for your star.

### Example usage

```
import stardate as sd

# Create a dictionary of observables
iso_params = {"teff": (5777, 10), # Teff with uncertainty.
              "logg": (4.44, .05), # logg with uncertainty.
              "feh": (0., .001), # Metallicity with uncertainty.
              "parallax": (1., .01), # Parallax in milliarcseconds.
              "maxAV": .1} # Maximum extinction

prot, prot_err = 26, 1

# Set up the star object.
star = sd.star(iso_params, prot, prot_err) # Here's where you add a rotation period
```



# stardate (Cross-submitted to AJ and JOSS)

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**stardate.readthedocs.io**  
**github/ruthangus/stardate**

stardate 0.0.1

Search docs

Installation

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### Example usage

```
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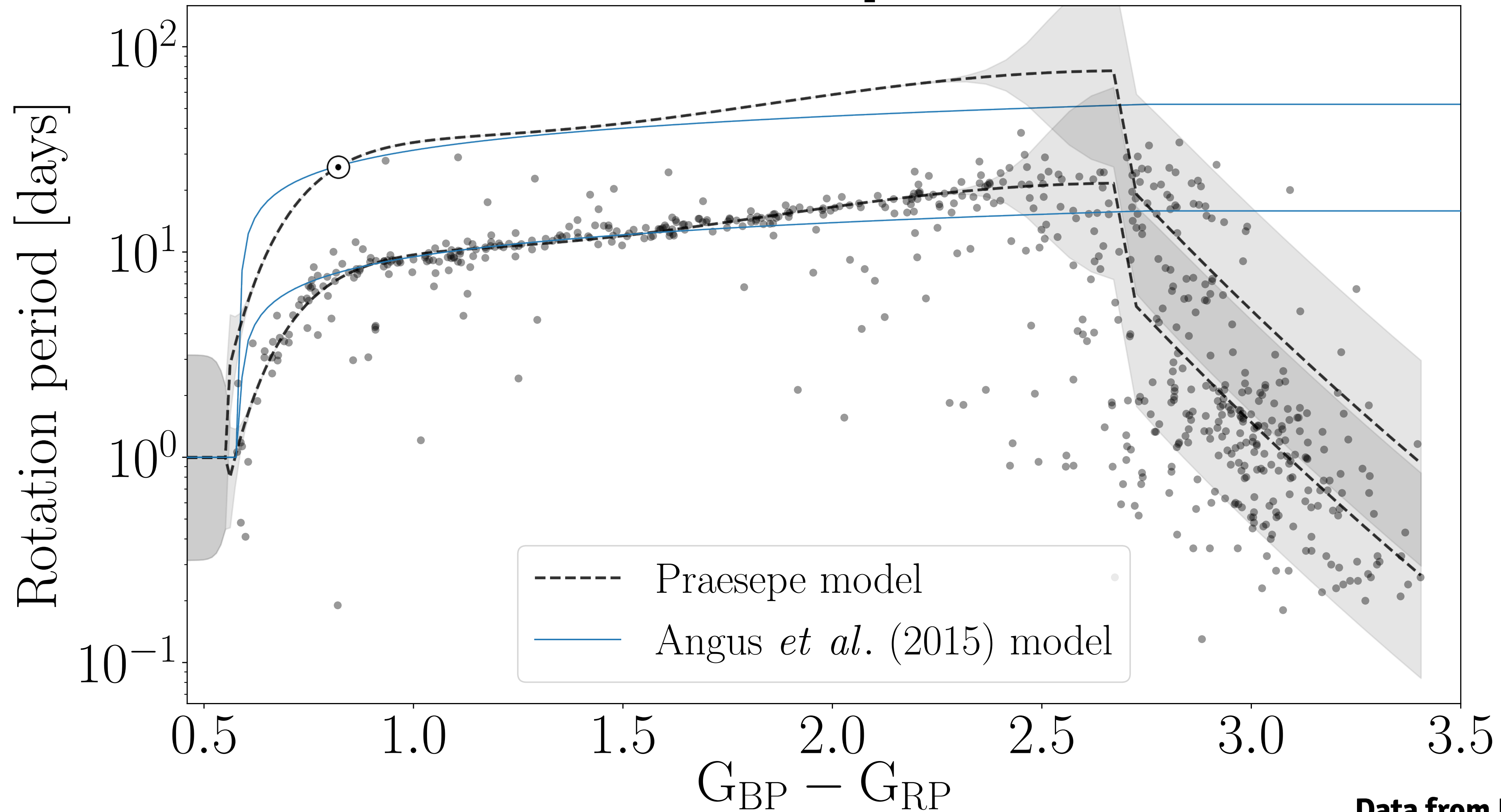
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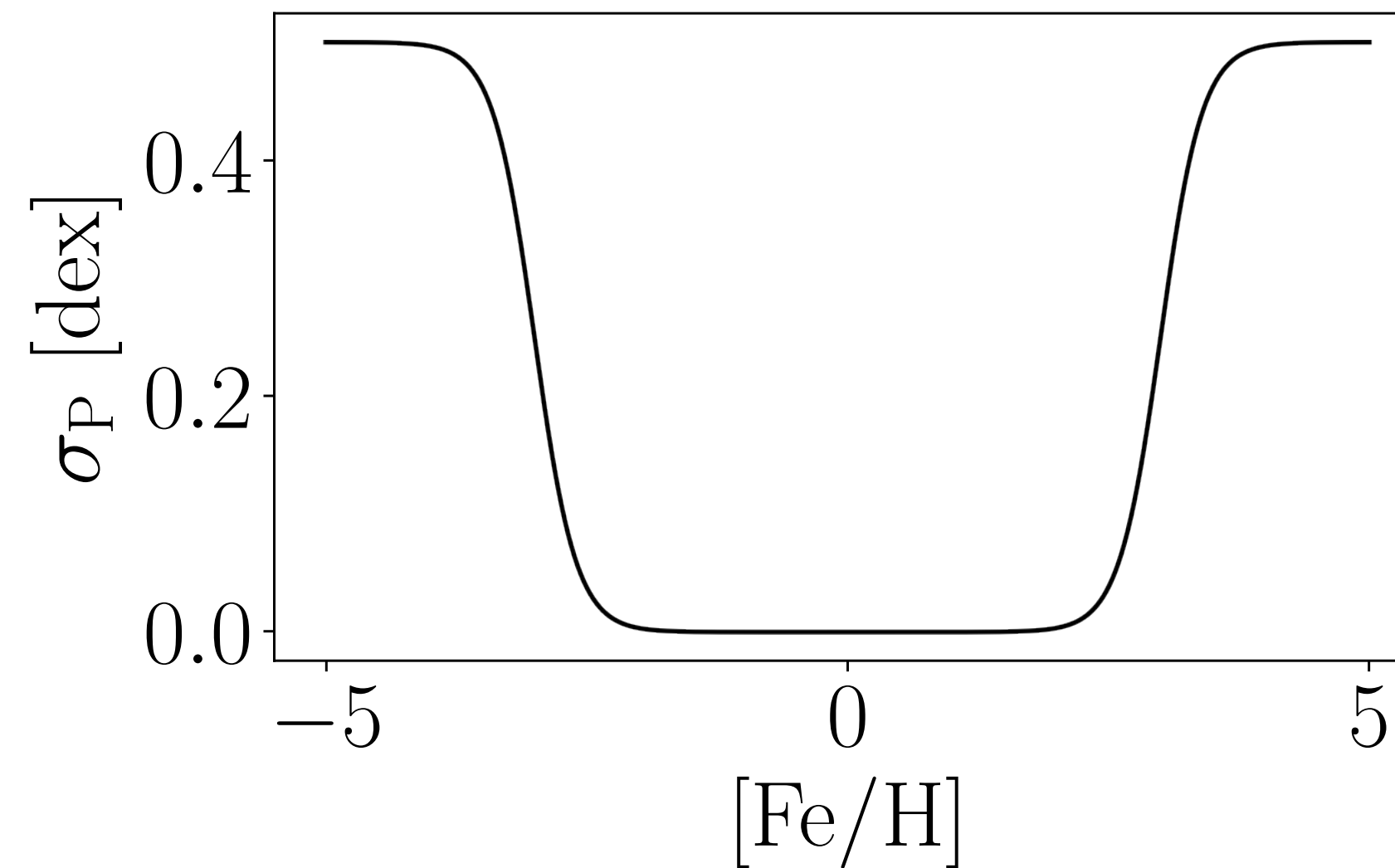
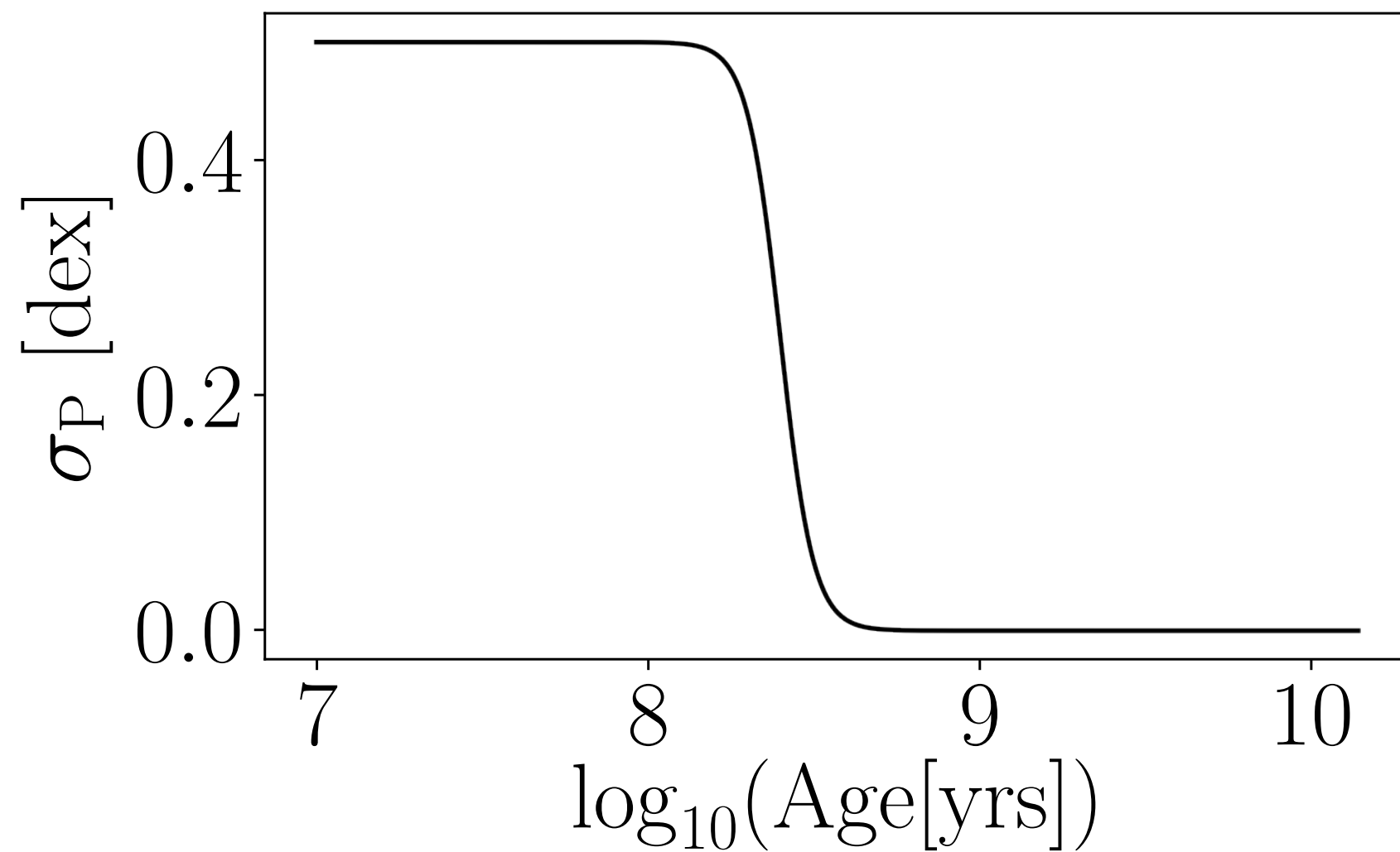
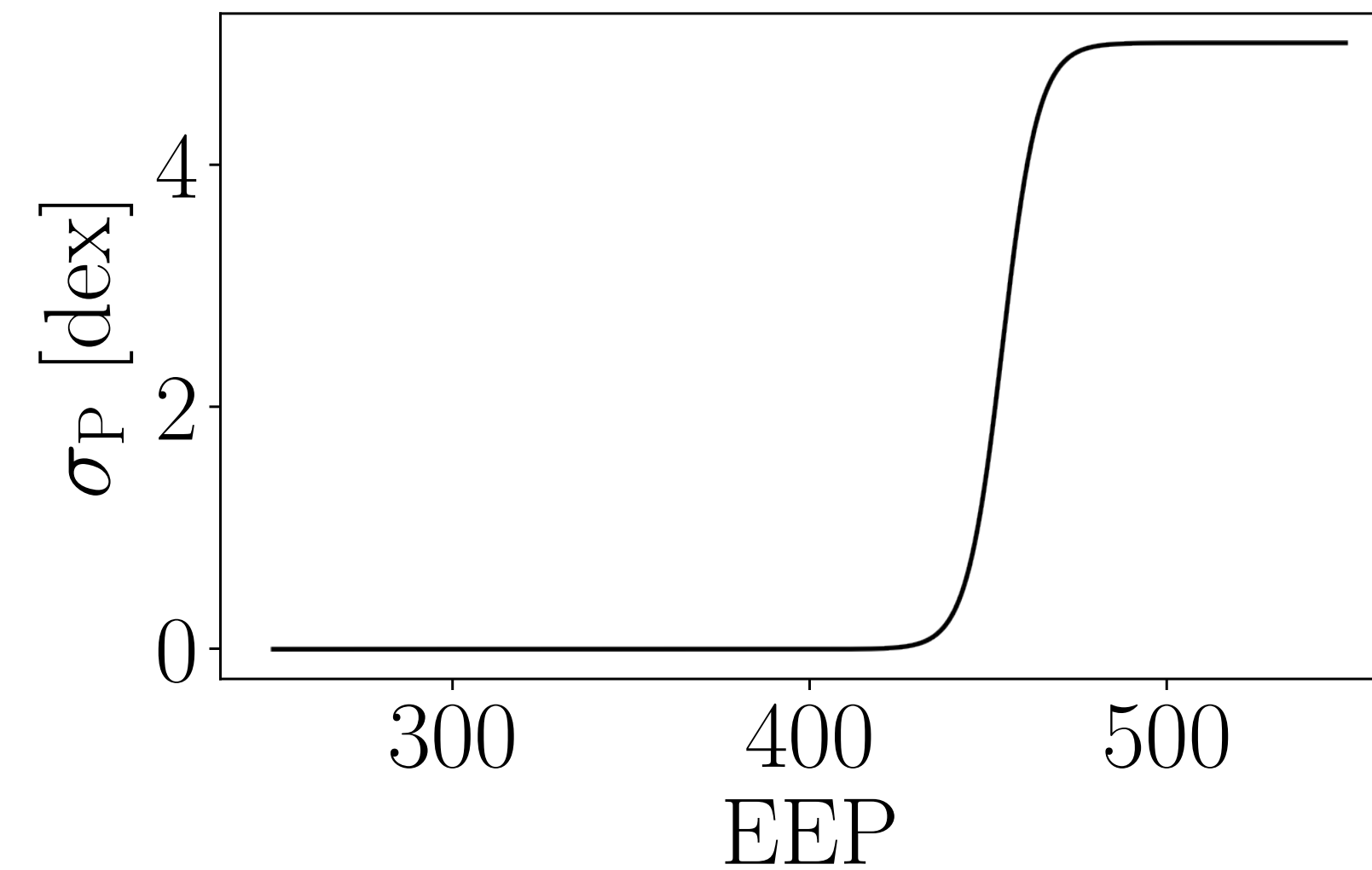
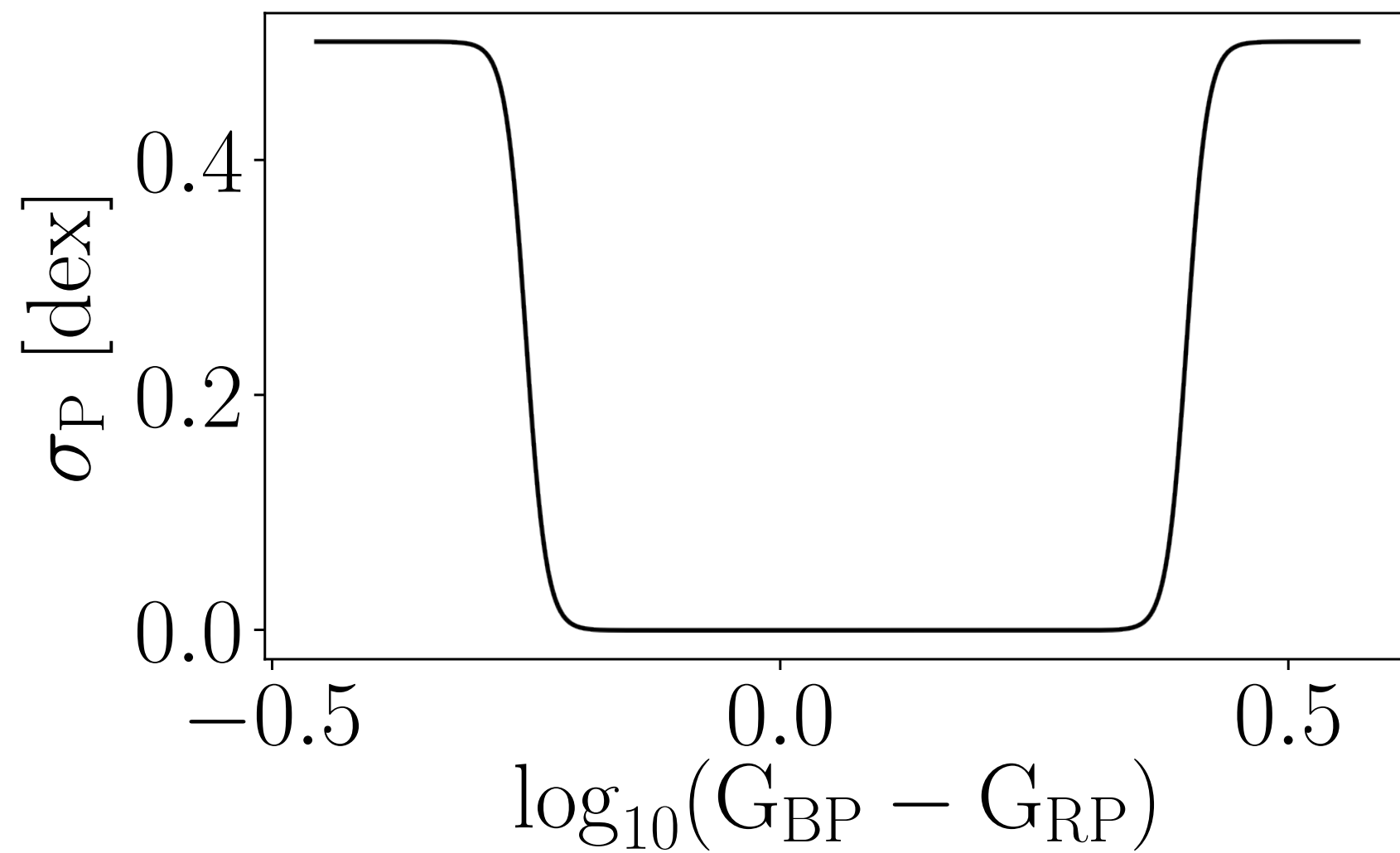
# Calibrating to Praesepe & the Sun

~650 Myrs



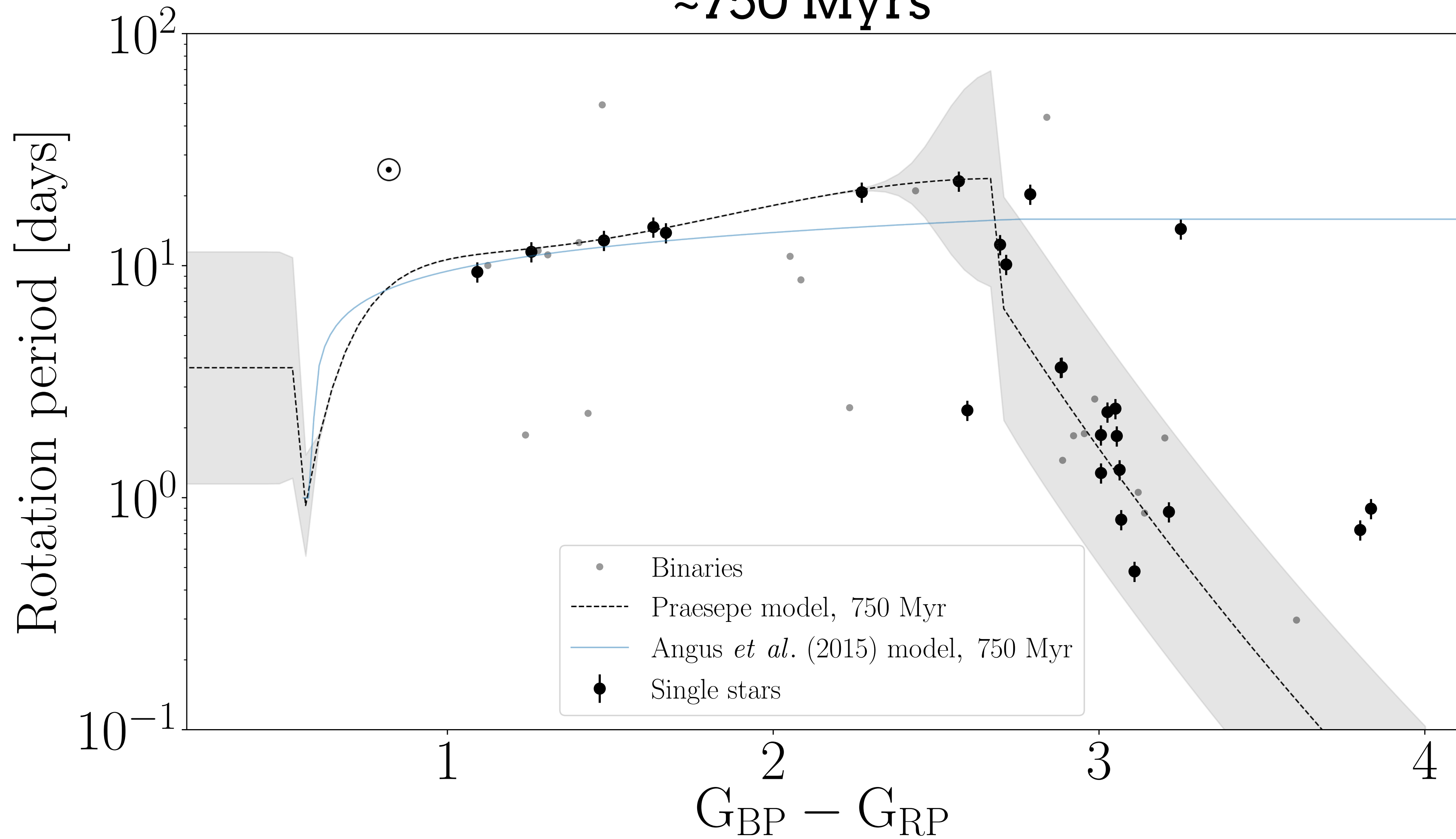
**Data from Douglas et al. (2017)**  
**See also Douglas et al. (2019)**  
**ArXiv: 1905.06736**

# Inflating the variance where gyro doesn't apply (or is poorly calibrated)



# The Hyades

~750 Myrs

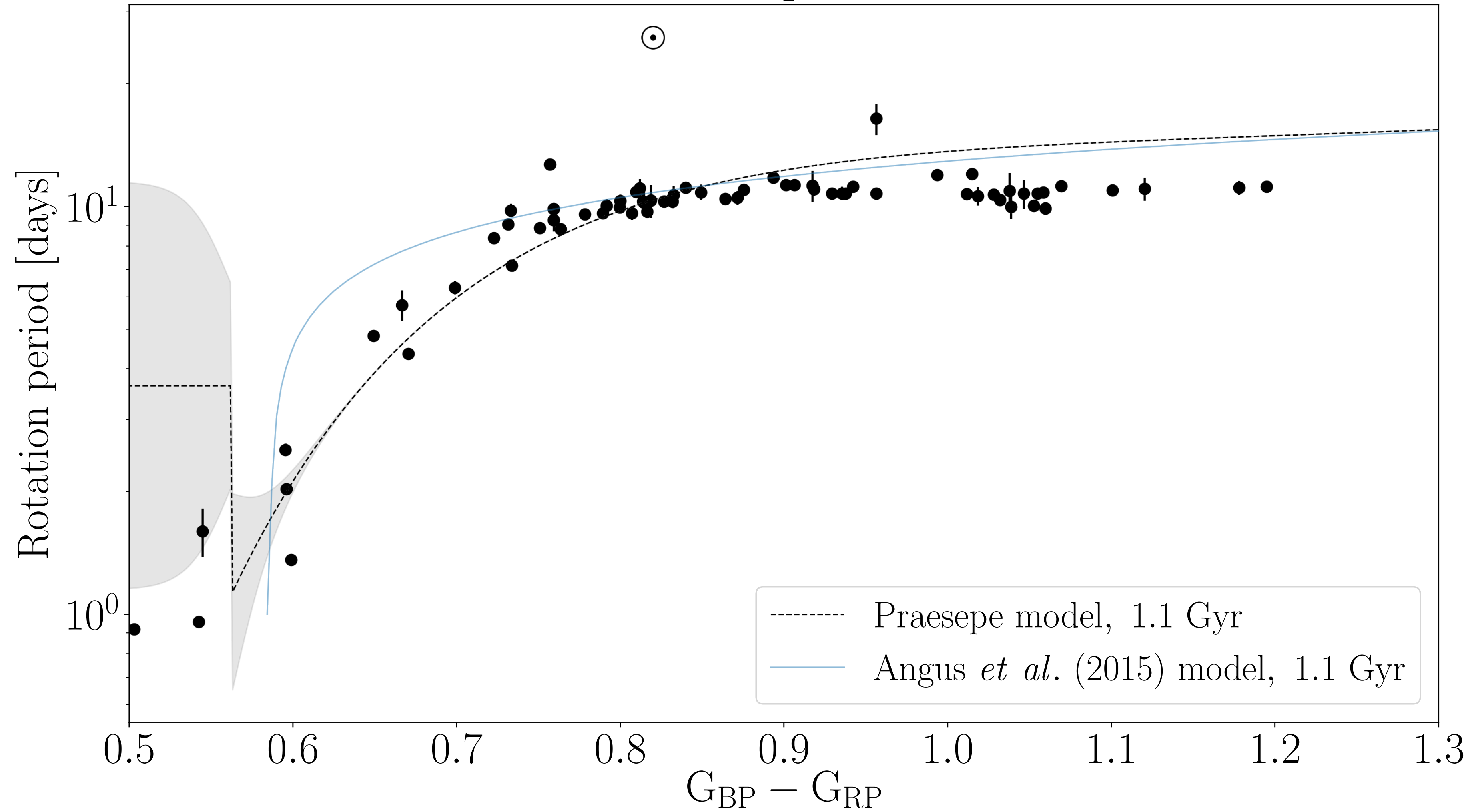


Data from Douglas et al. (2016)

# NGC 6811

## 1.1 Gyrs

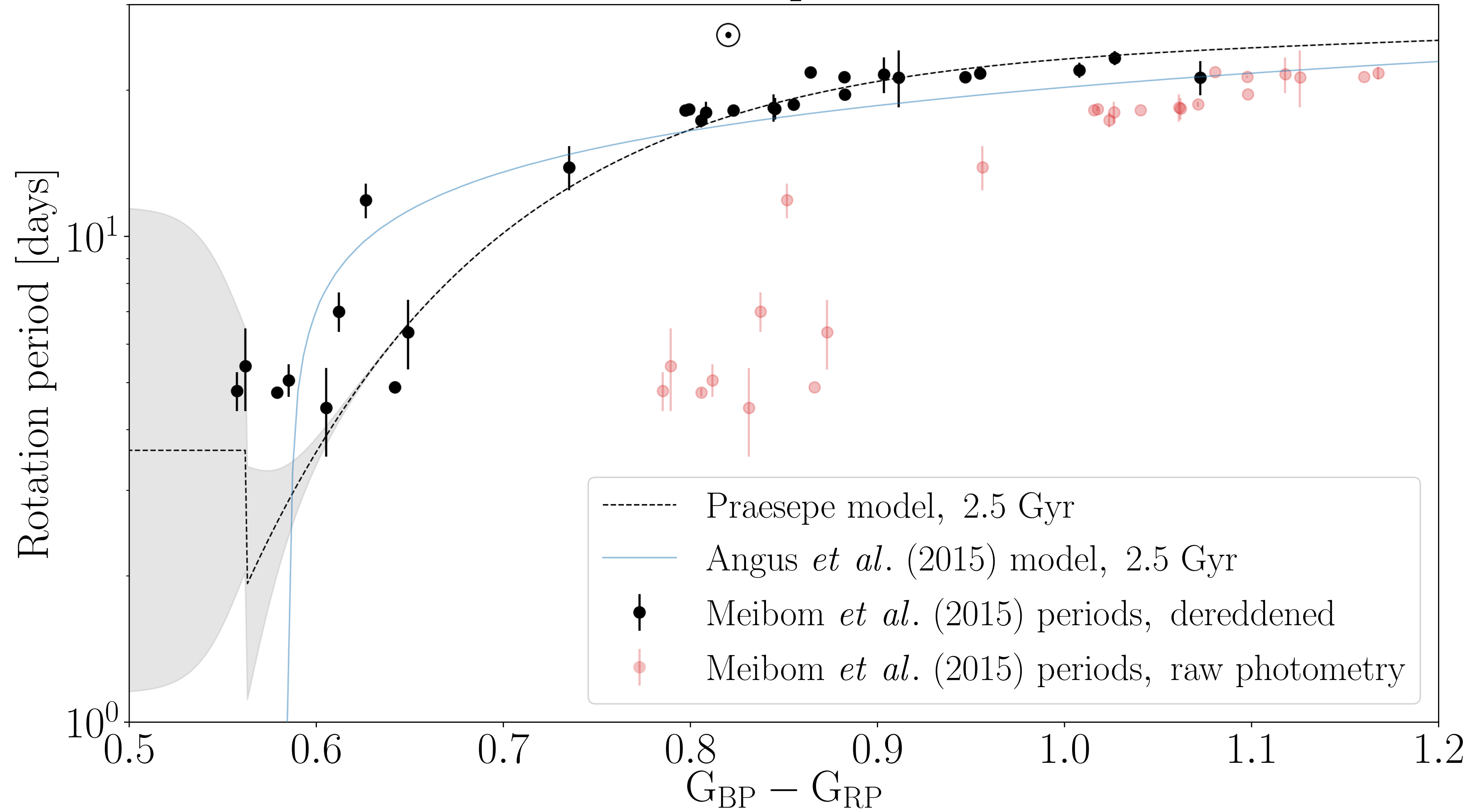
See Curtis et al. (2019)  
ArXiv: 1905.06869



**Data from Meibom et al. (2011)**

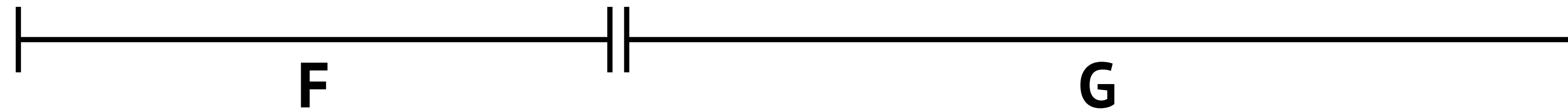
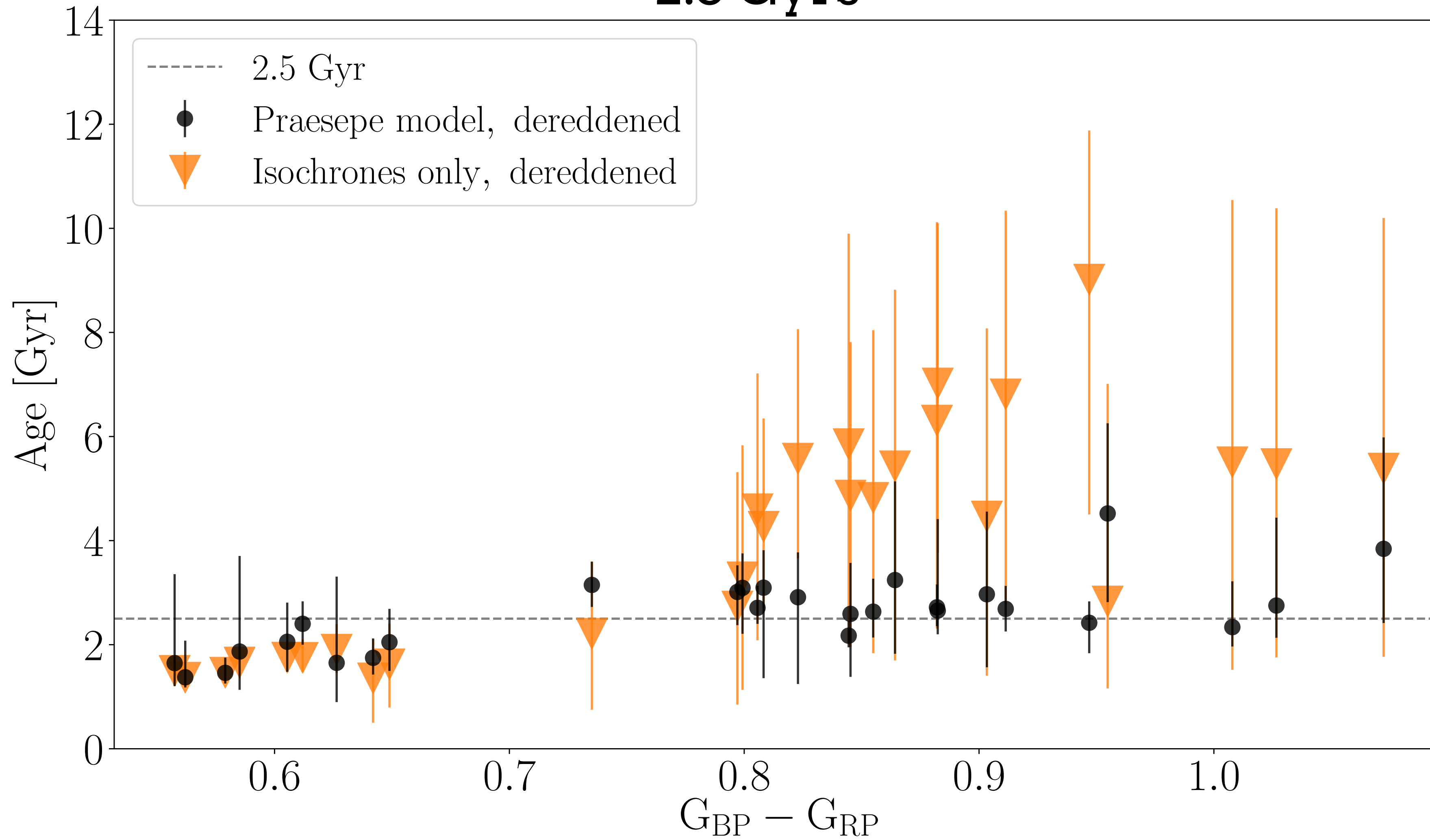
# NGC 6819

## 2.5 Gyrs



# NGC 6819

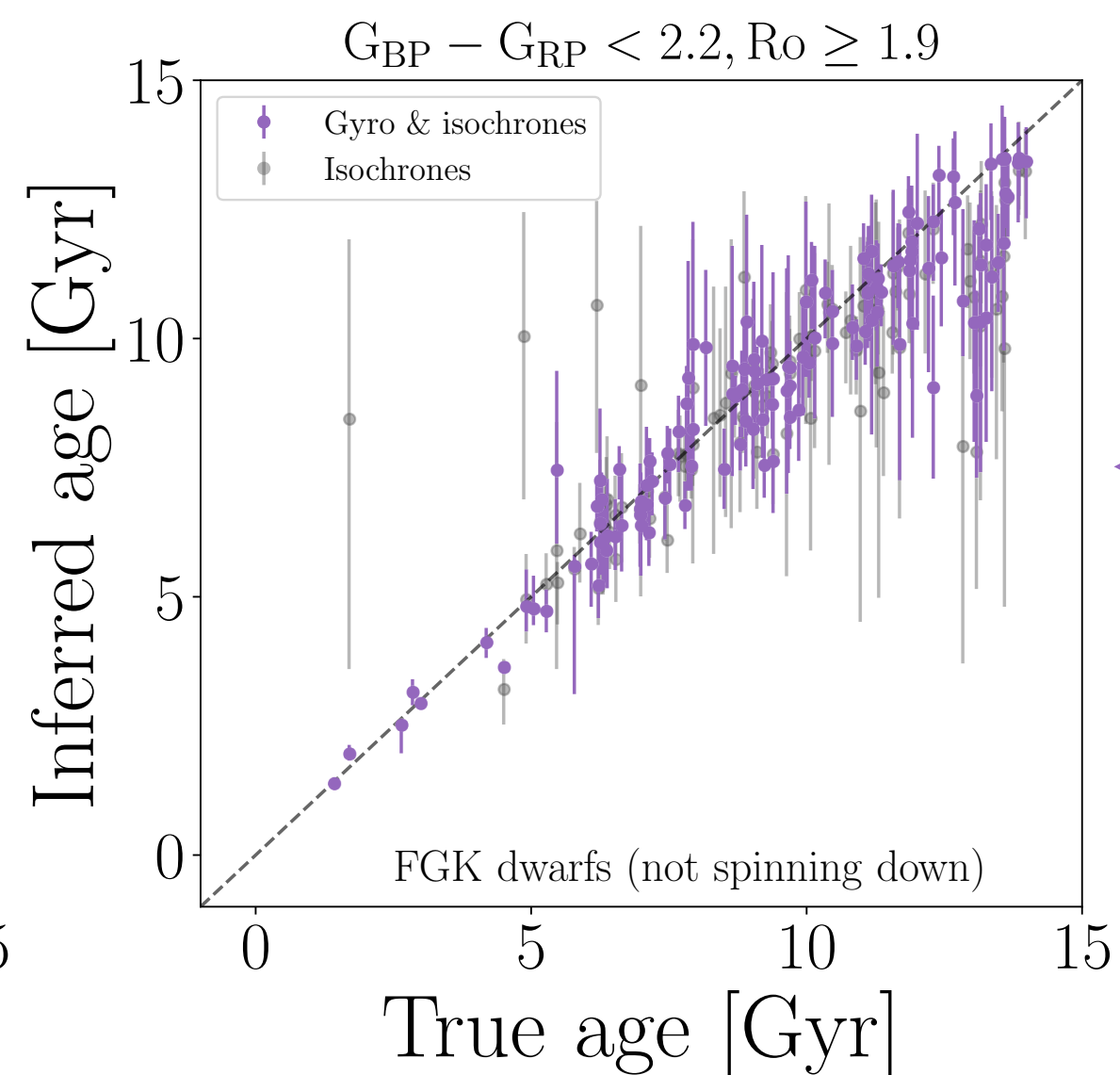
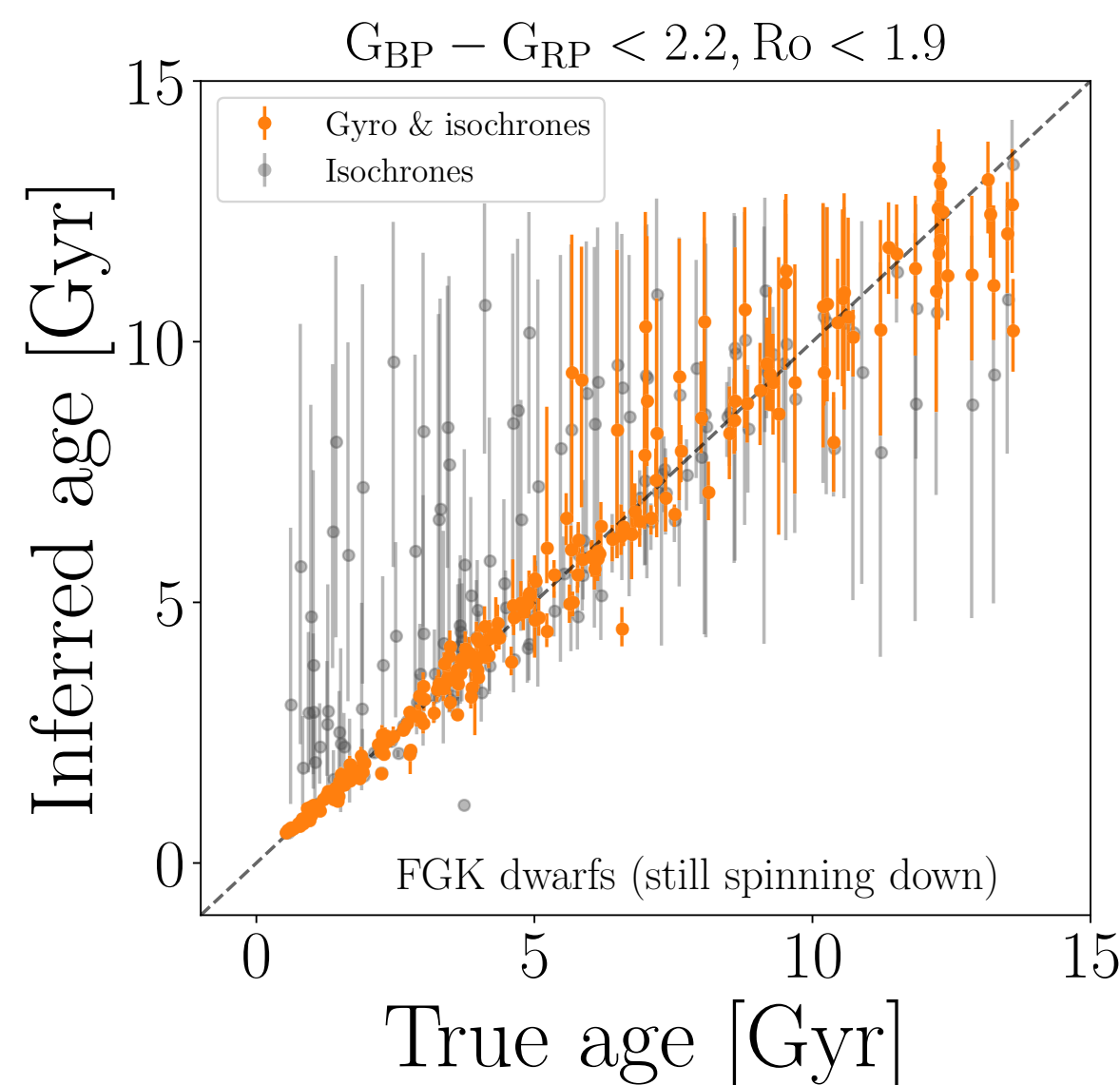
## 2.5 Gyrs



# Combining gyrochronology & isochrones

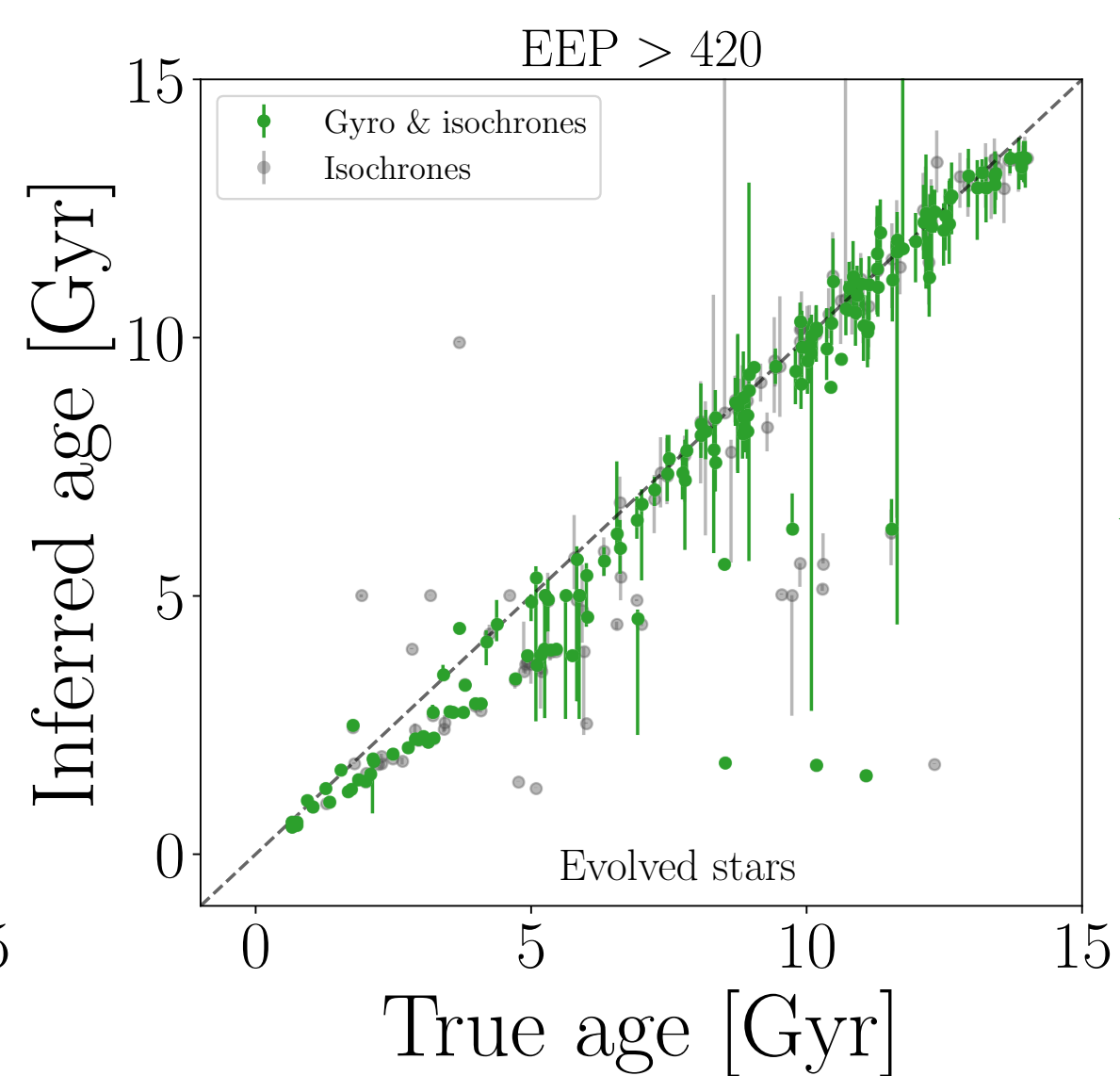
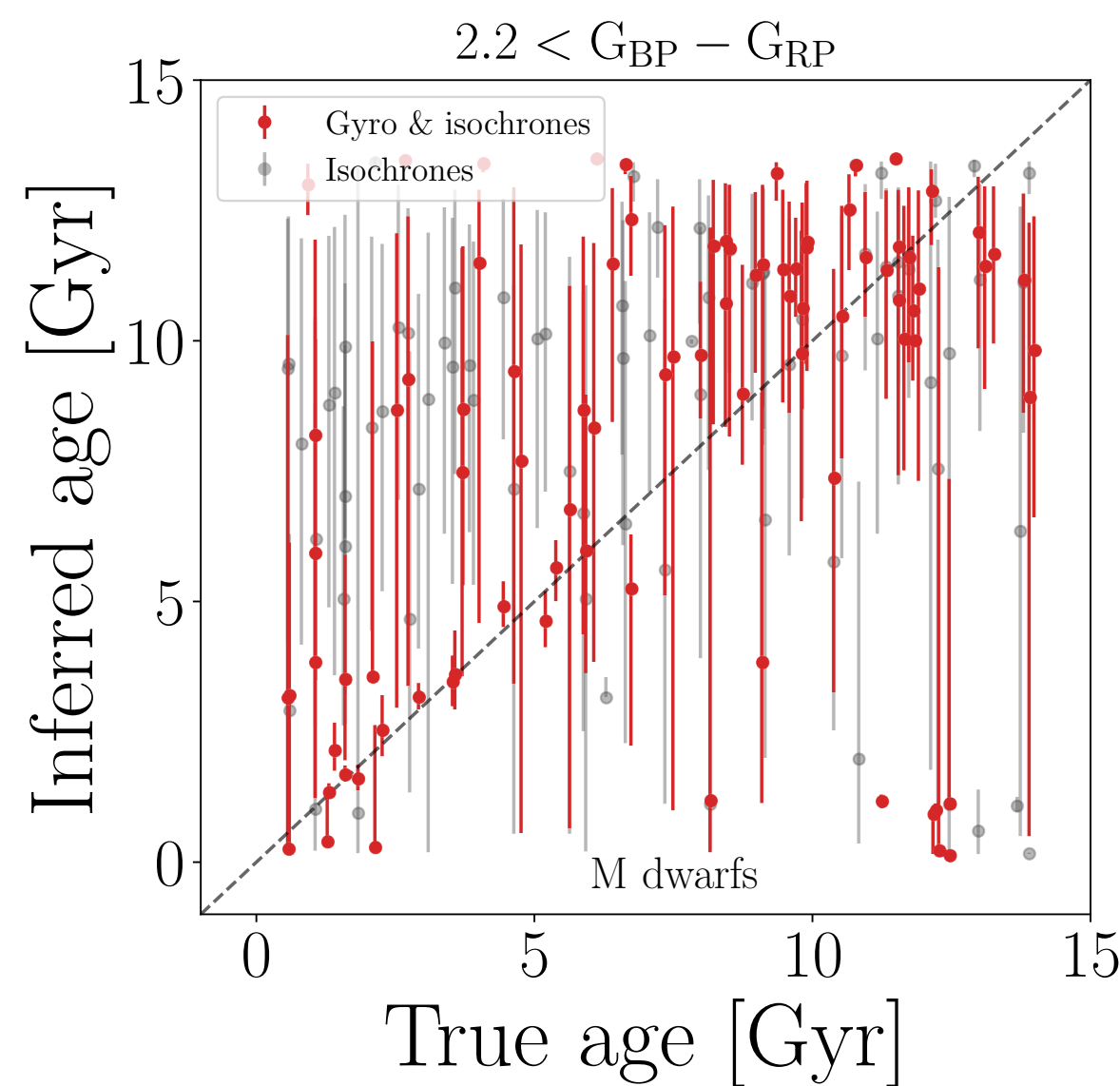
Angus et al. (submitted)

**FGK dwarfs** →



← **Old FGK dwarfs**

**M dwarfs** →



← **Subgiants**



# Combining gyrochronology & isochrones

Angus et al. (submitted)

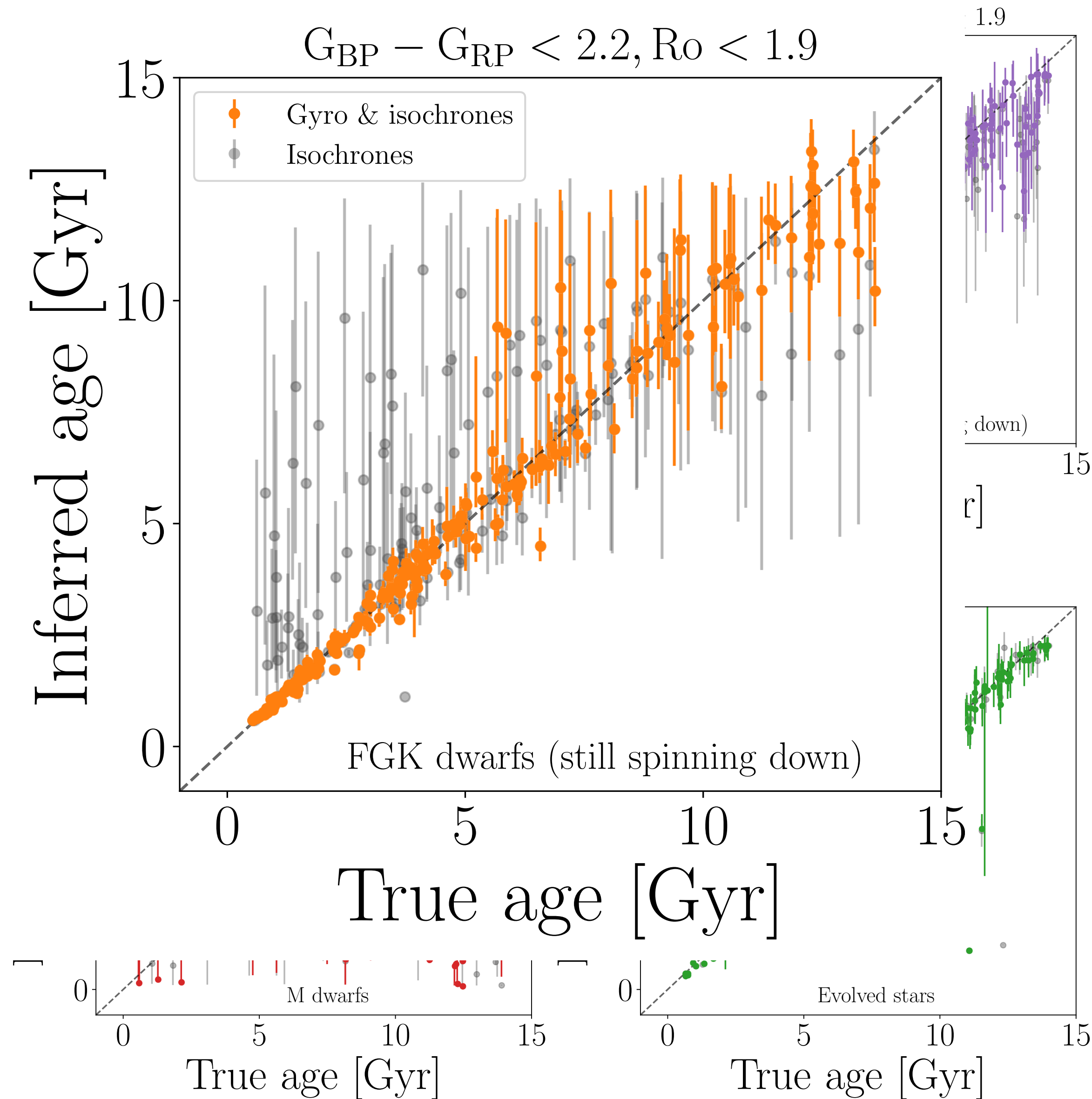
$$G_{BP} - G_{RP} < 2.2, R_o < 1.9$$

**FGK dwarfs** →

← **Old FGK dwarfs**

**M dwarfs** →

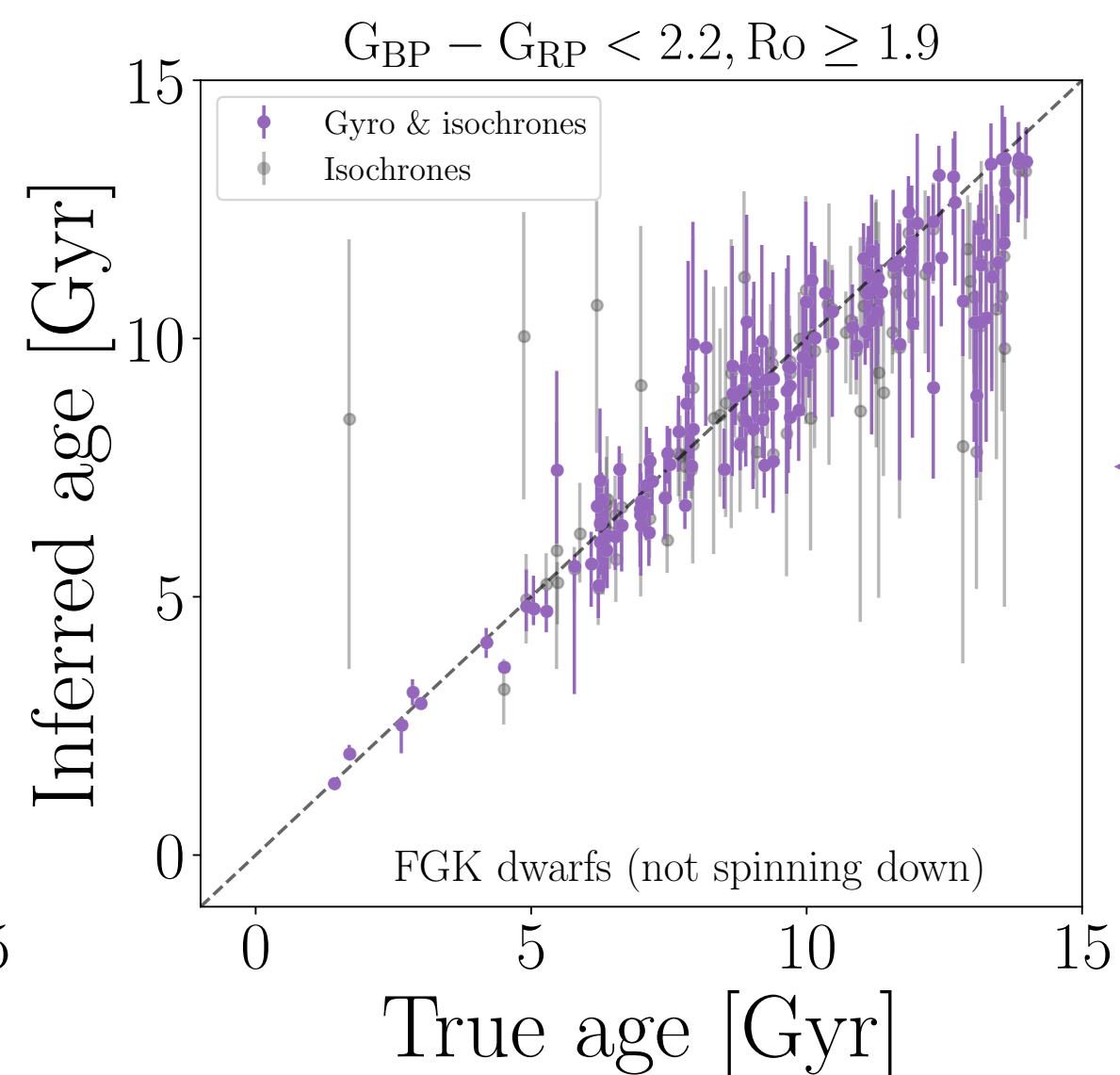
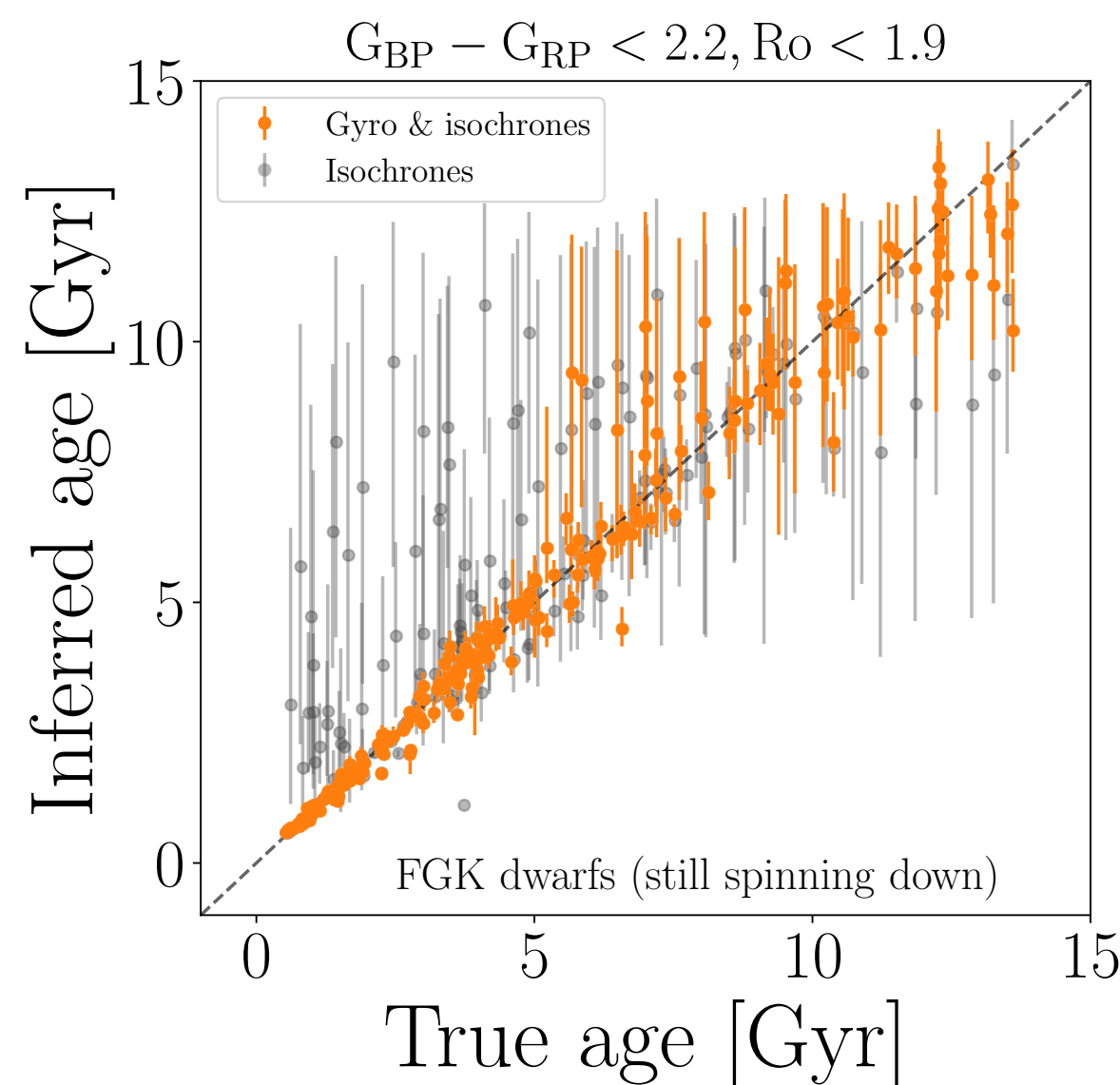
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# Combining gyrochronology & isochrones

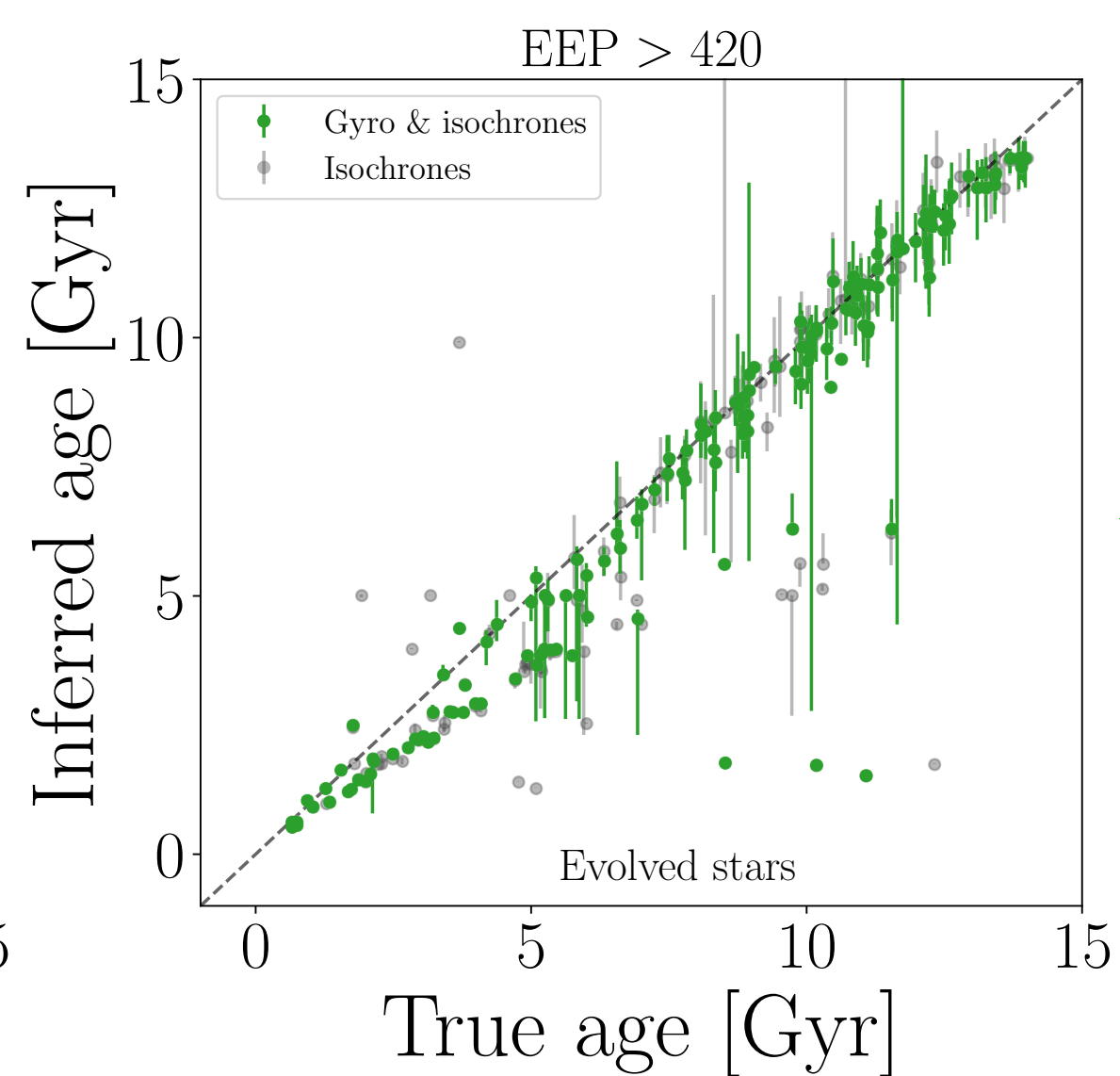
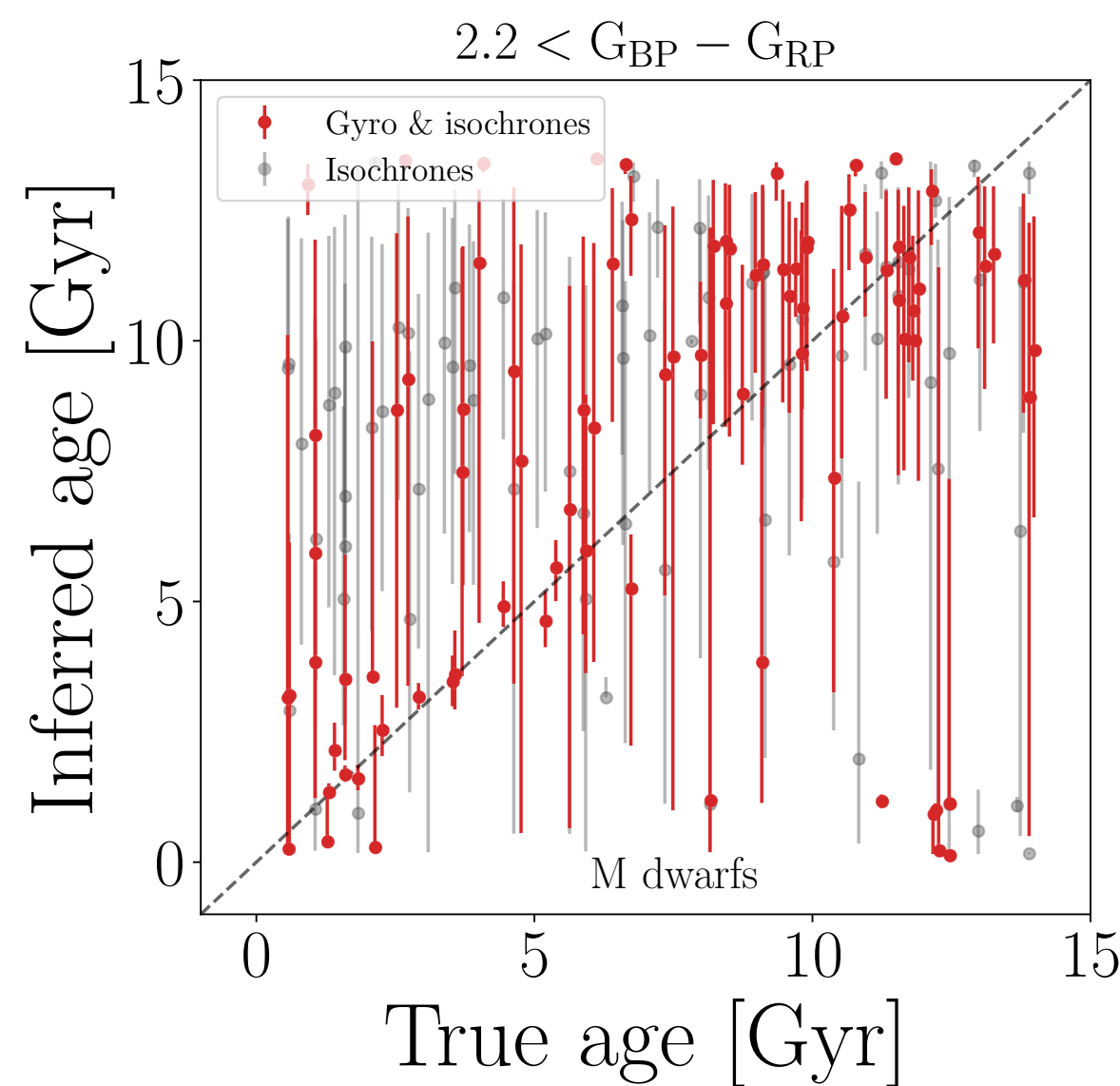
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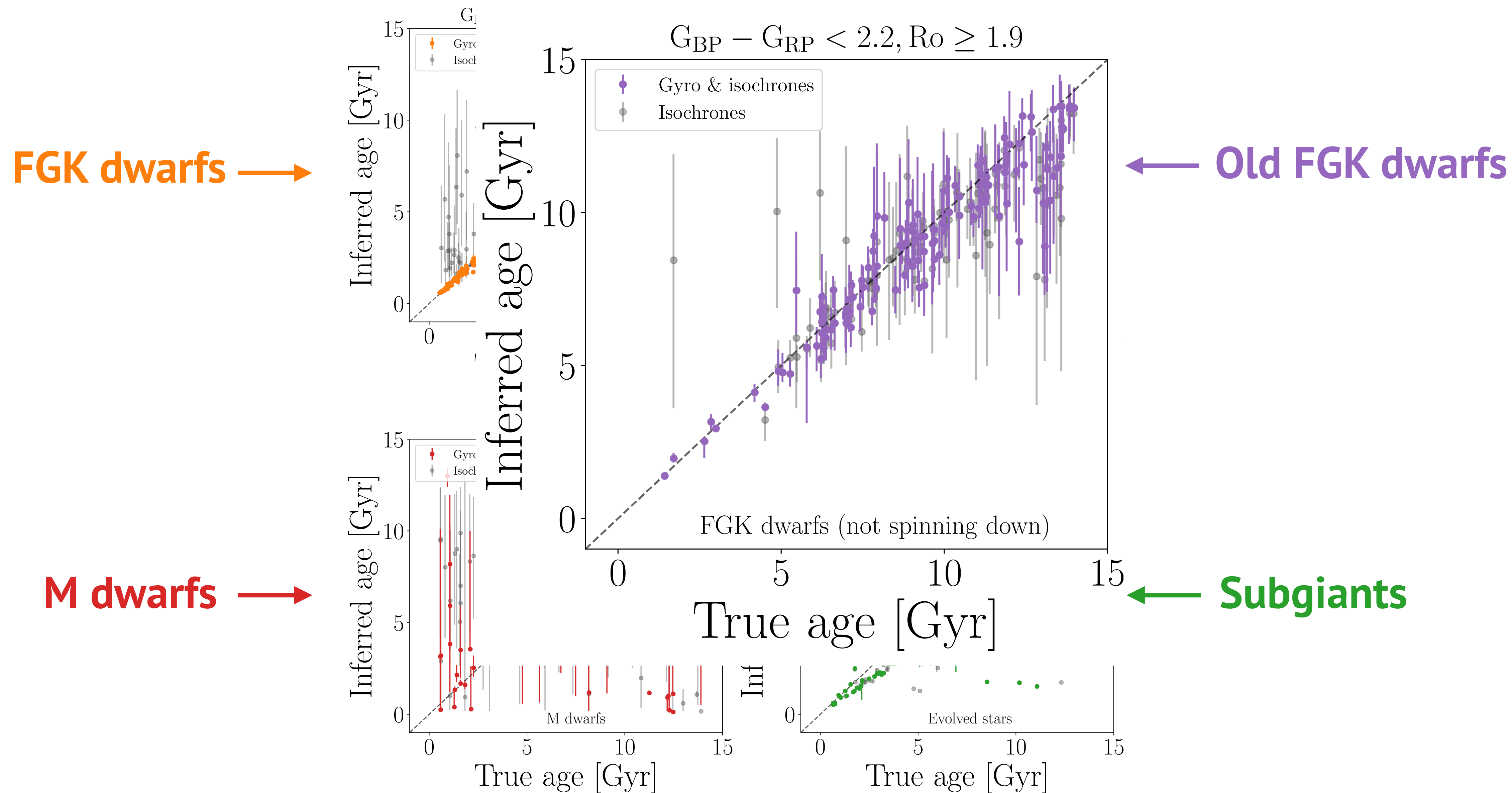
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# Combining gyrochronology & isochrones

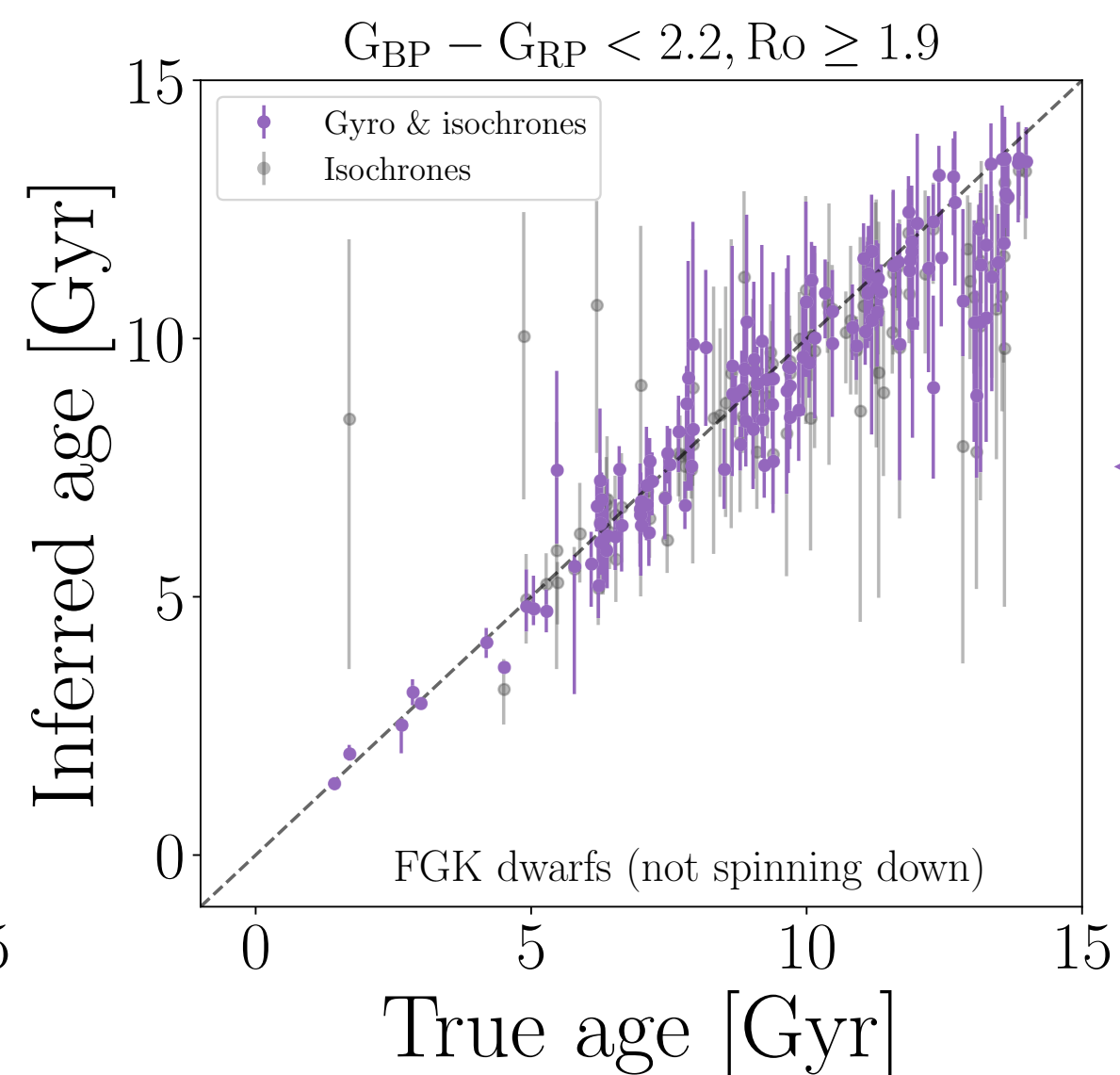
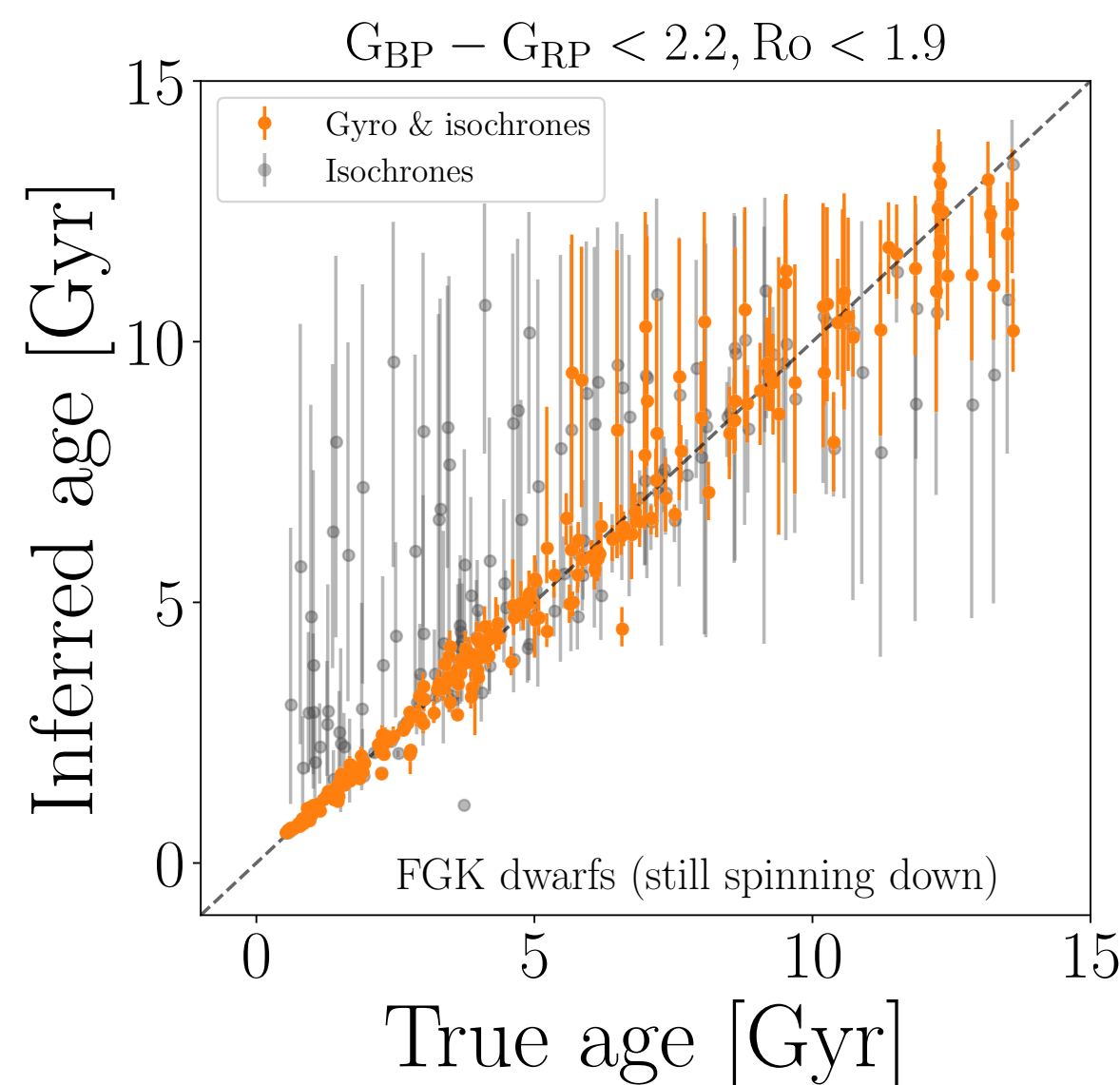
Anaus et al. (submitted)



# Combining gyrochronology & isochrones

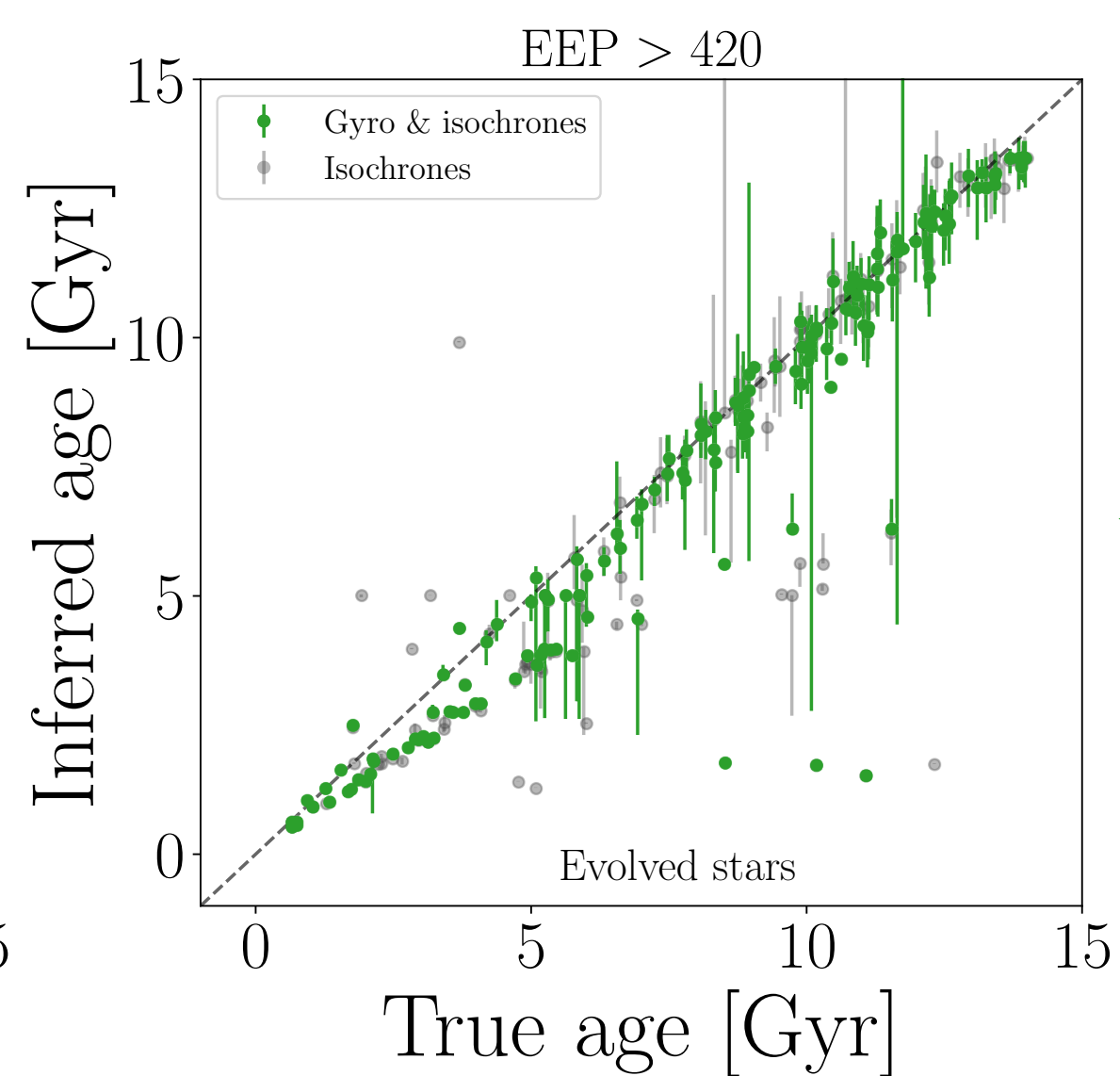
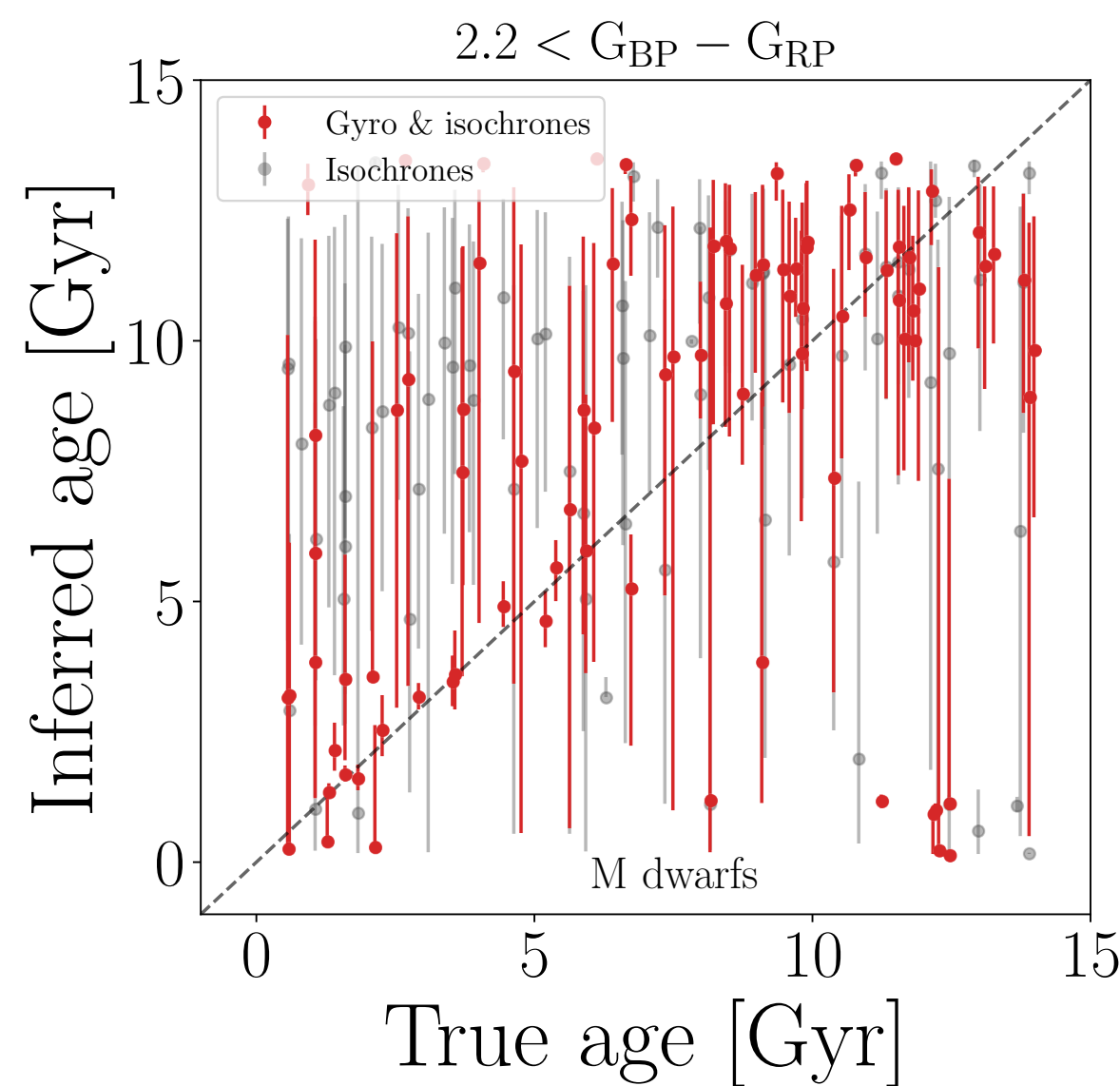
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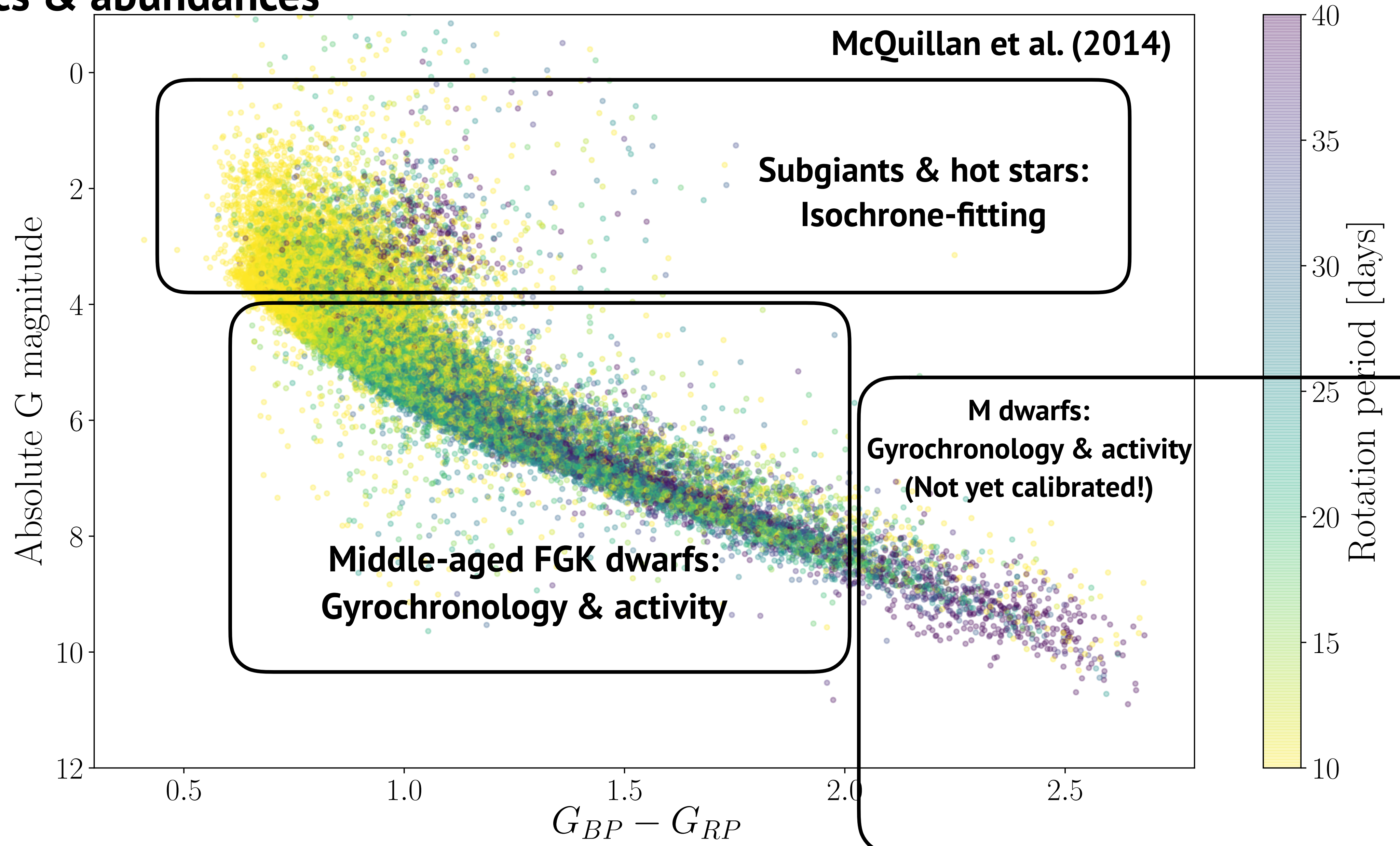
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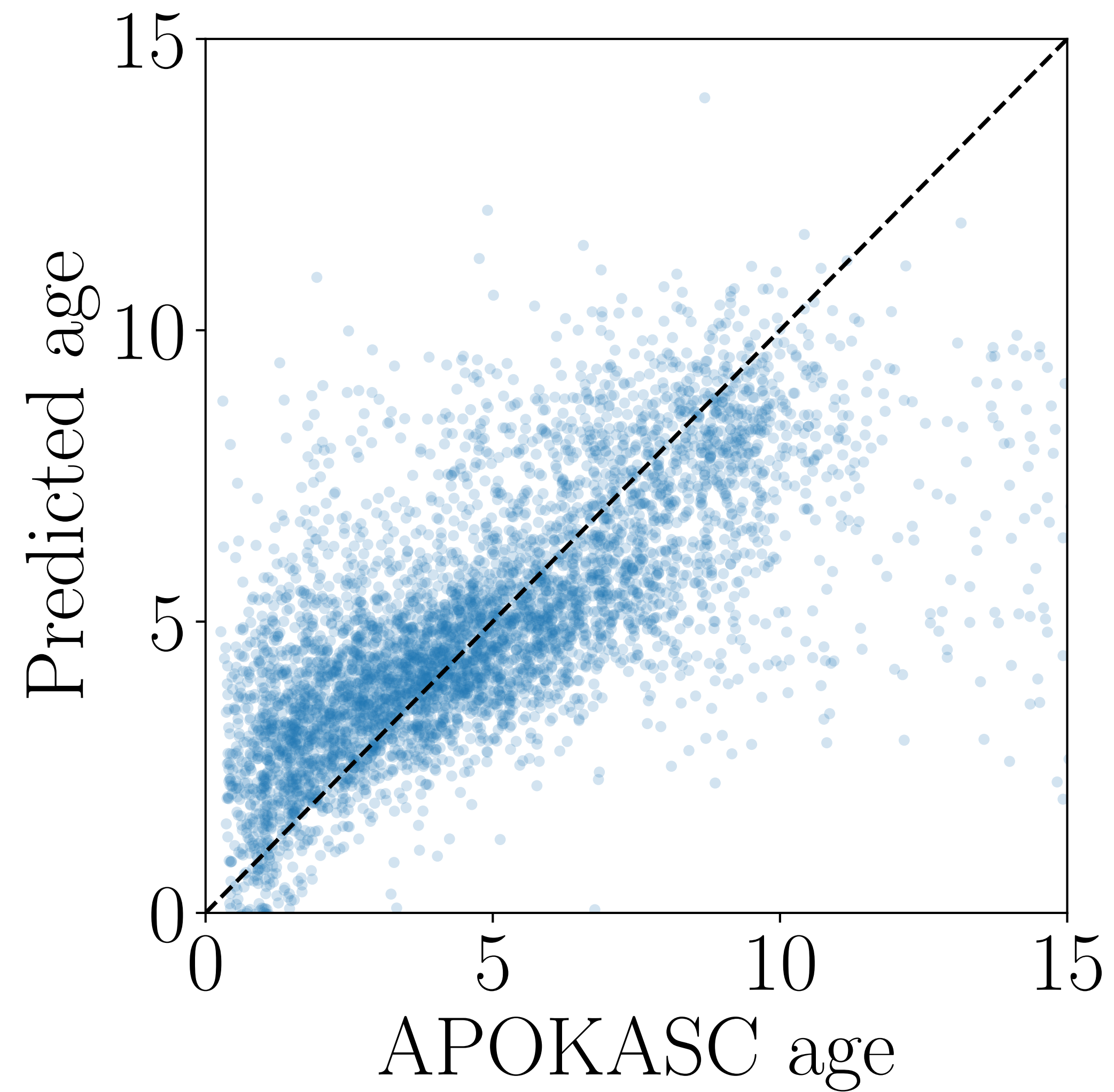
# All stars: Kinematics & abundances

## Stellar rotation on the CMD



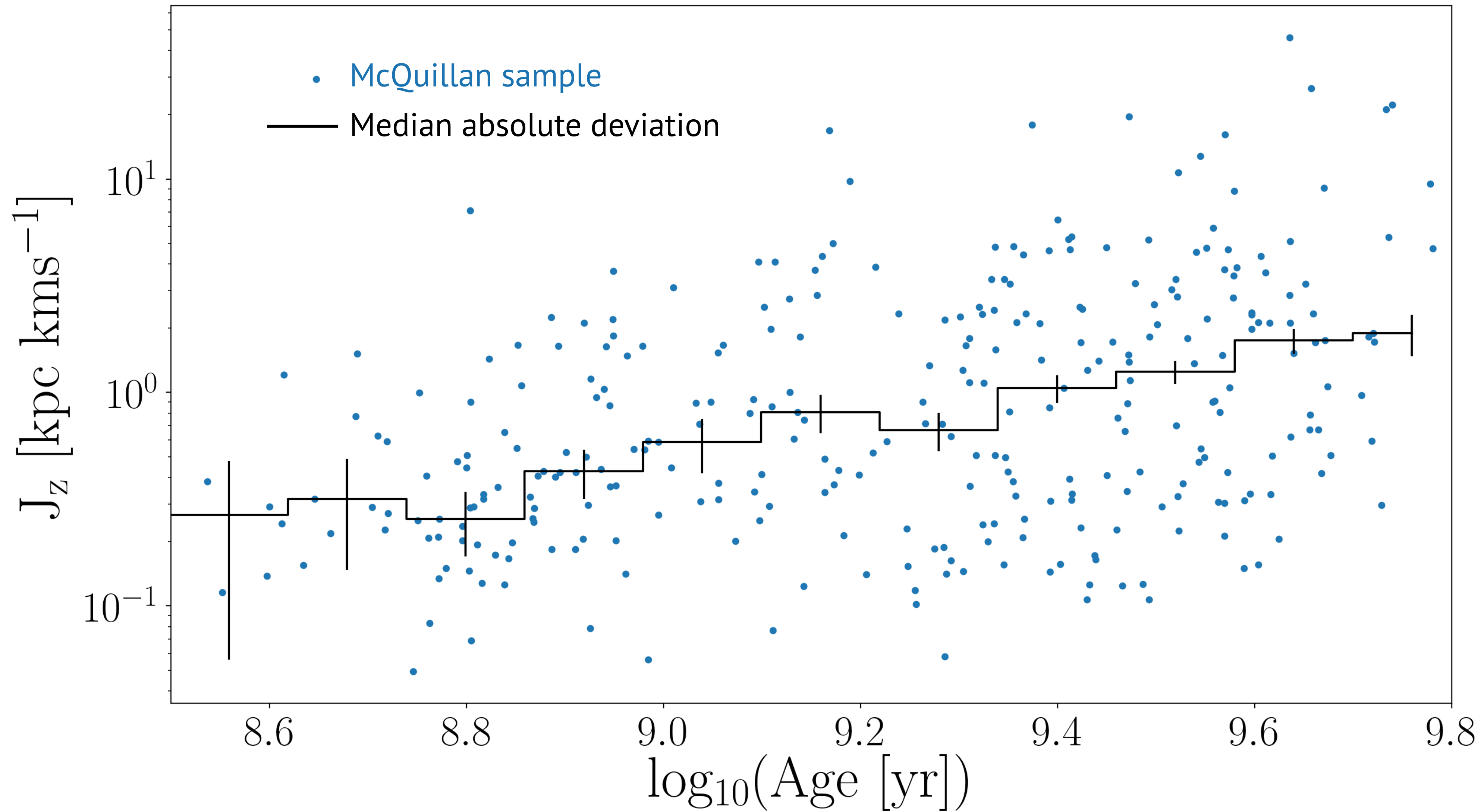
# Stellar ages from **abundances**

Made at KITP with Phil Muirhead, Jamie Tayar & Melissa Ness



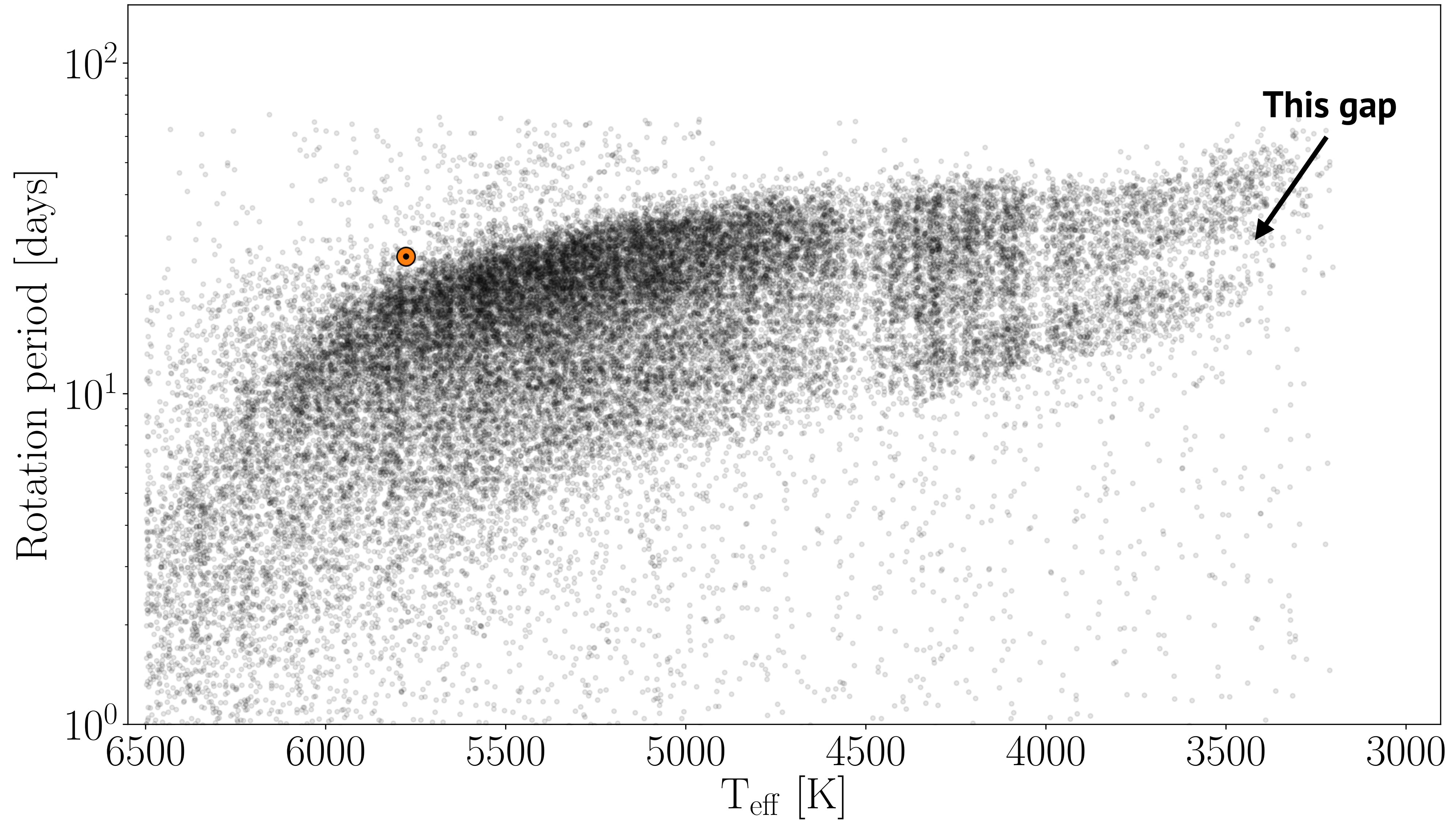
# Stellar ages from **kinematics**

Made at KITP



# Rotation vs Temperature

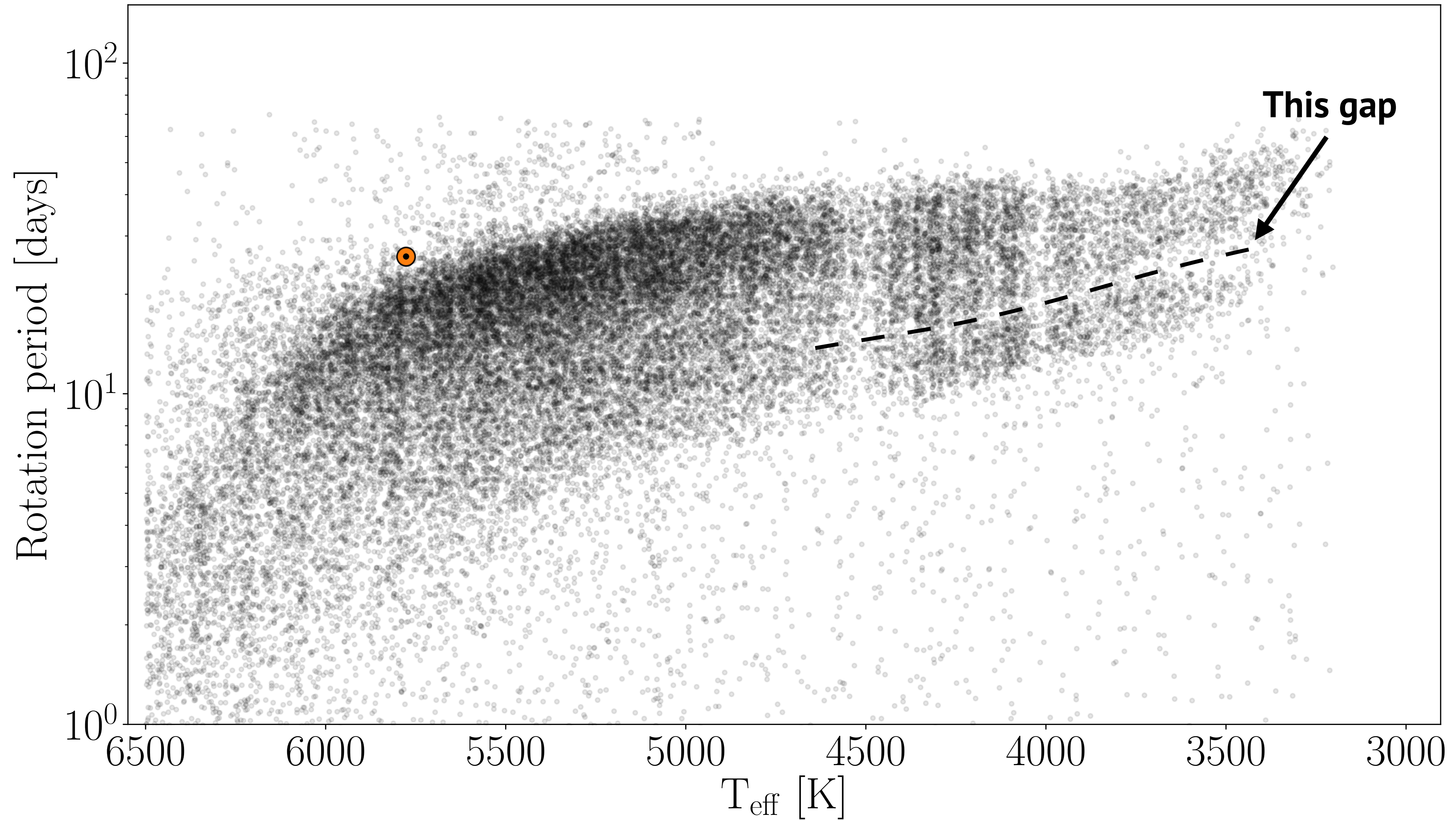
McQuillan et al. (2014)





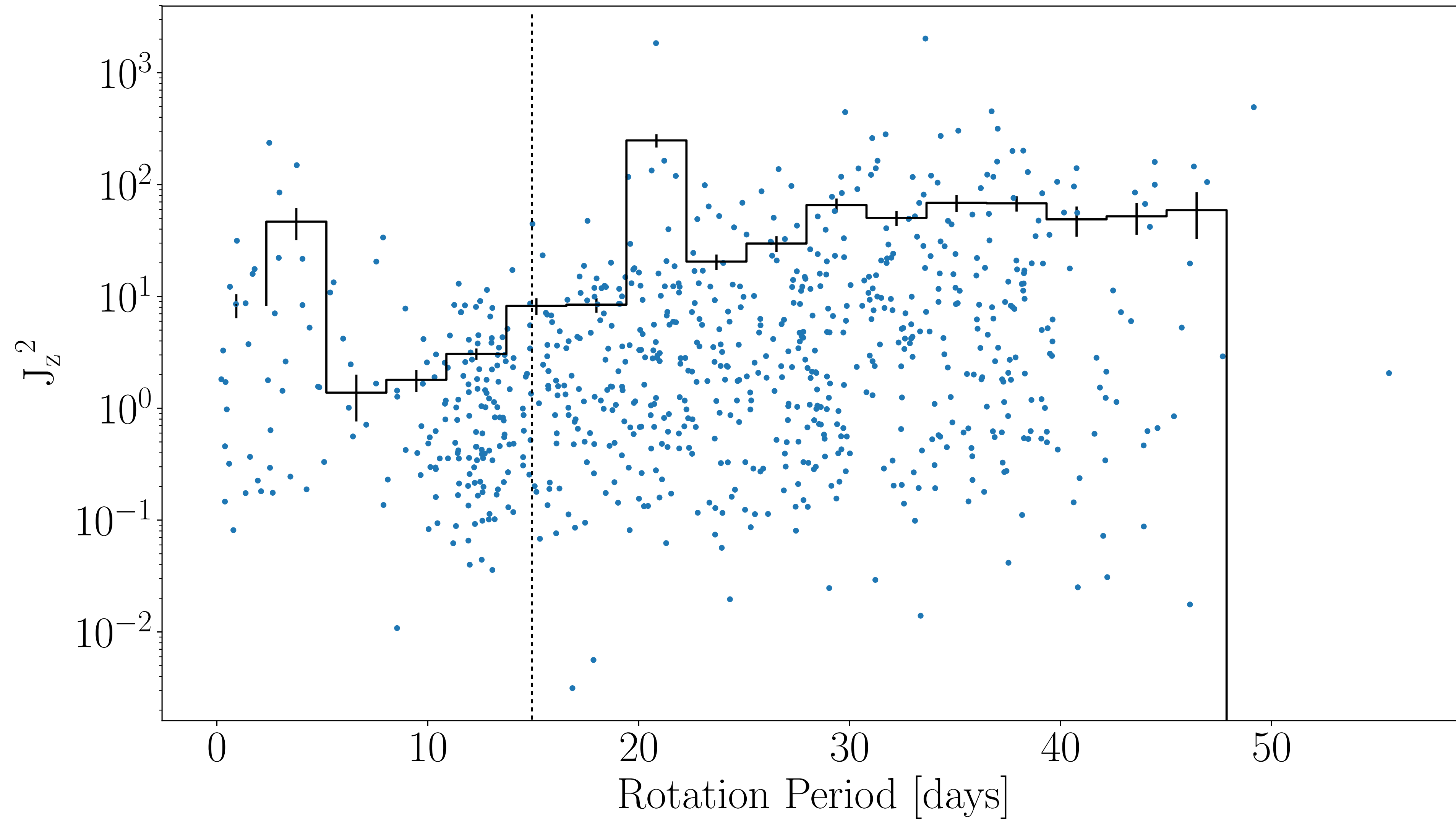
# Rotation vs Temperature

McQuillan et al. (2014)



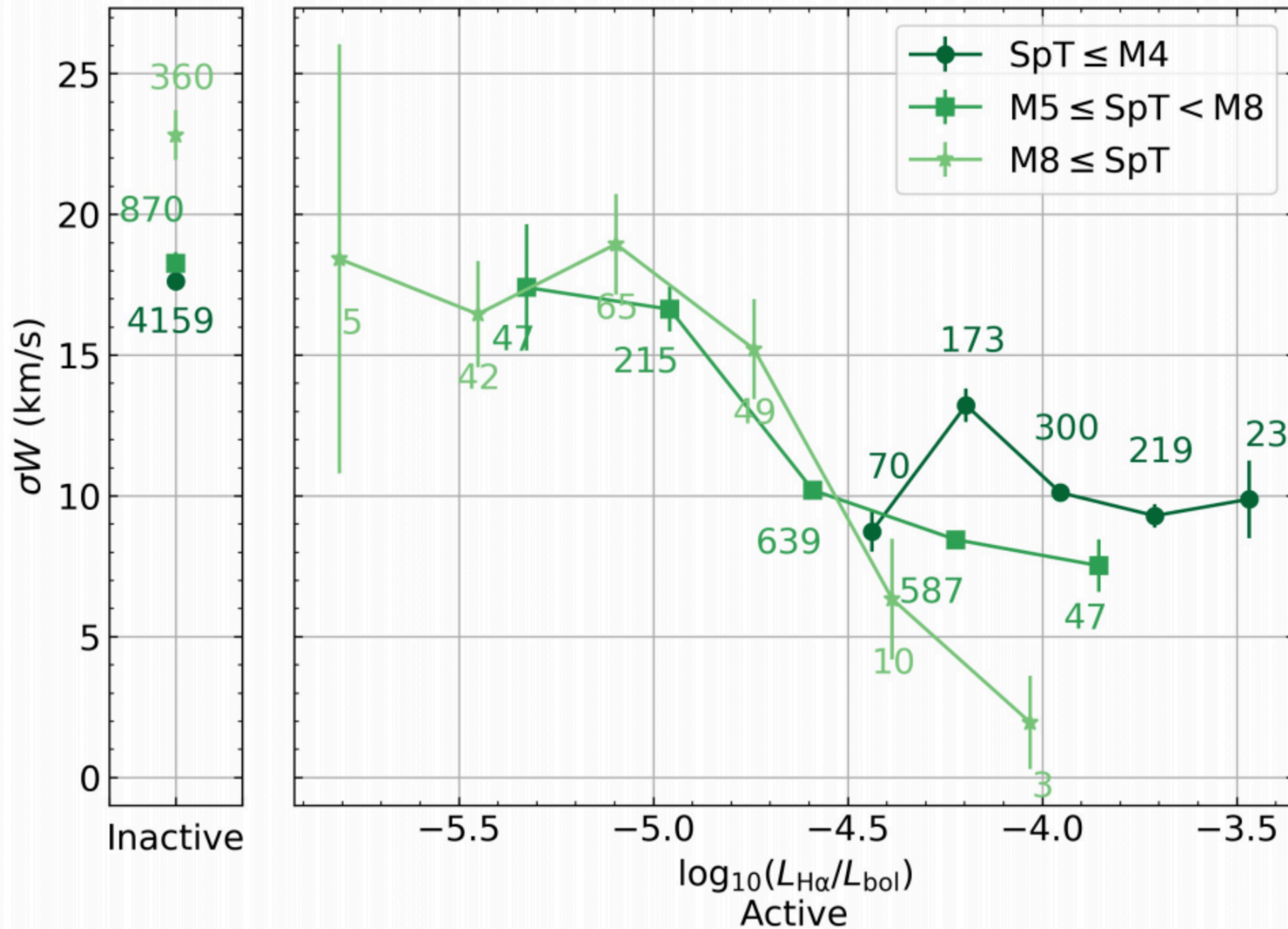
# Stellar ages from **kinematics**

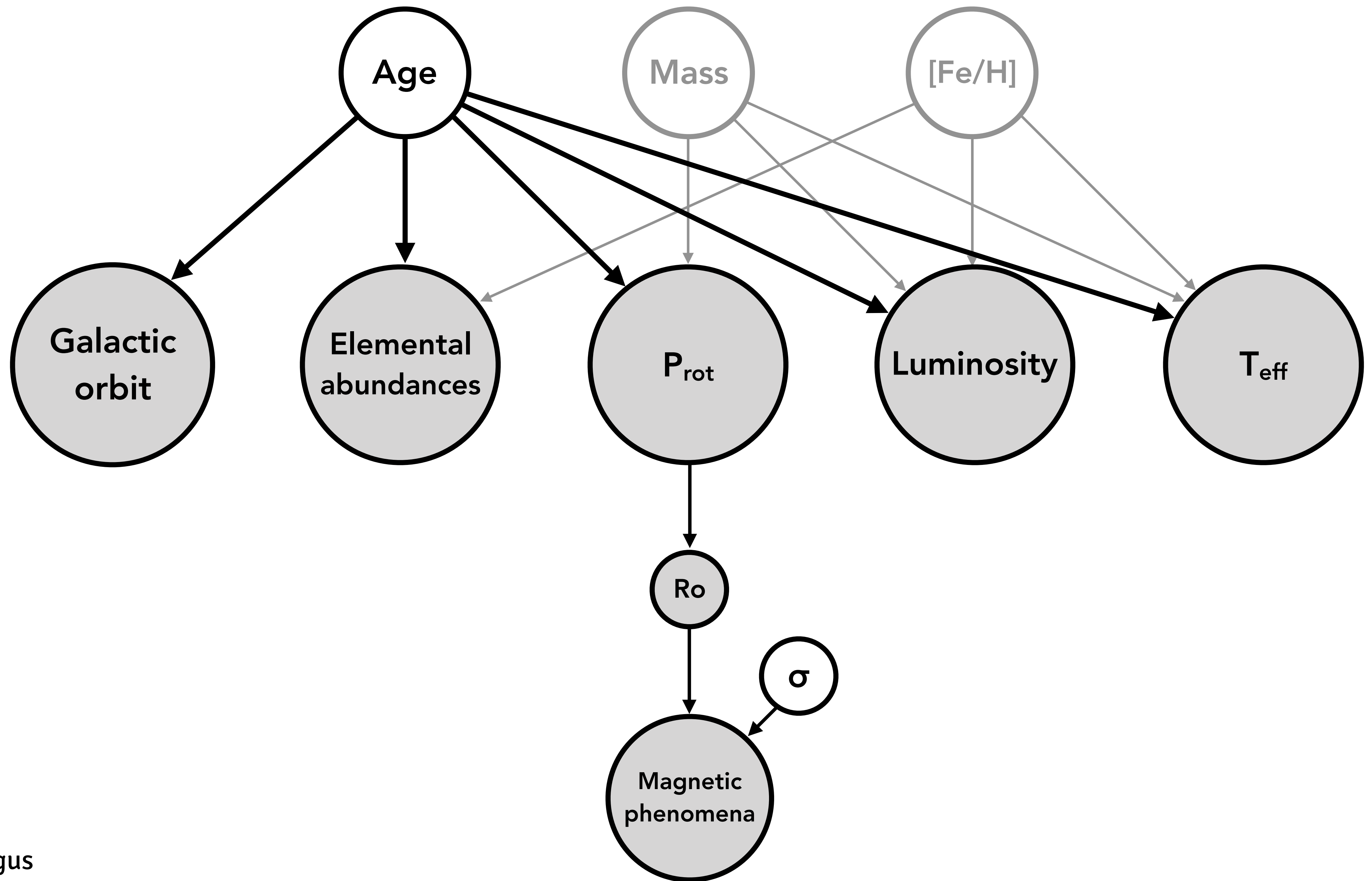
Made at KITP



# Ages of M dwarfs from magnetic activity & Kinematics

**Rocio Kiman (CUNY)** Kiman *et al.*, (2019) arXiv:1904.05911





# Measuring stellar ages from light curves

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**Ruth Angus**

**Assistant Curator & Professor, Department of Astrophysics, American Museum of Natural History**

**Associate Research Scientist, Center for Computational Astrophysics, Flatiron Institute**

**Assistant Adjunct Professor, Department of Astronomy, Columbia University**