

# Understanding stellar activity in the exoplanetary field

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# Outline

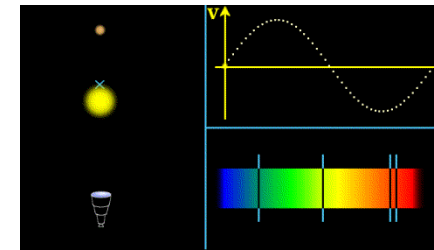
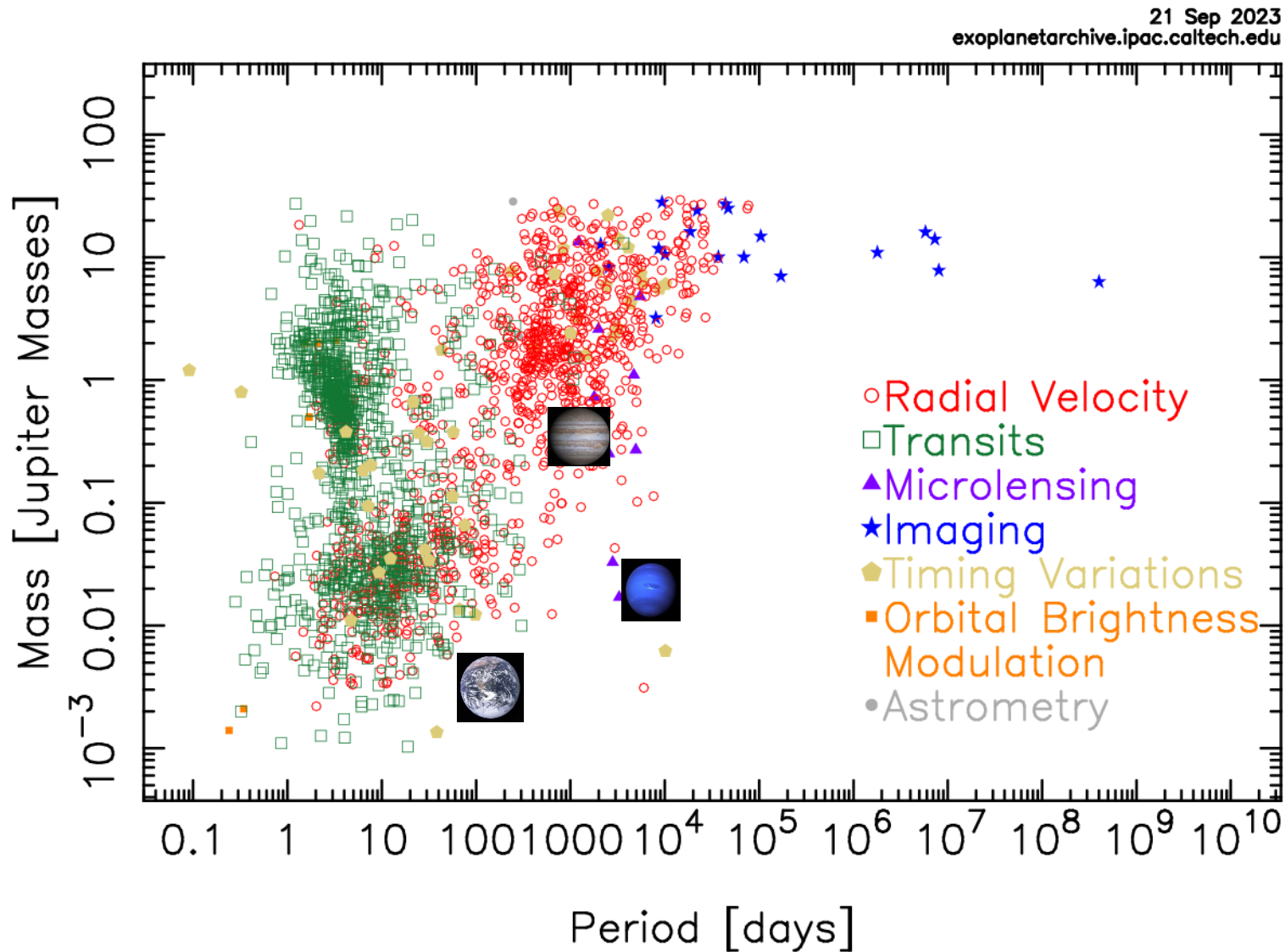
- Introduction: context and challenge
- Part 1: Stellar variability, overview, origin, what do we know from the Sun and for other stars
  - Magnetic activity
  - Flows
- Part 2: Methods to evaluate the impact and tools
  - Methods
  - Tools
- Part 3: Impact and approaches to mitigate the impact of stellar activity
  - RV
  - Photometric transits
  - Atmosphere characterisation (transmission spectroscopy)
  - Astrometry
- Conclusion

# Won't talk about...

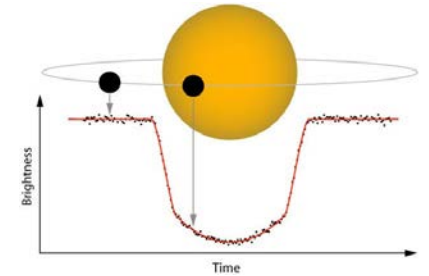
- **Direct imaging**
  - => *lecture A. Boccaletti*
- **Direct impact of the star on the planetary properties** (atmosphere, habitability...)
  - => *lectures Rim Fares, Ekaterina Ilin, Julián Alvarado Gómez, Sudeshna Boro Sakia*
- **Importance of knowledge of the star on different aspects** such as
  - Fundamental parameters, including age, radius (strong impact on transits), mass
  - Center-to-limb darkening
  - Distance
- **Other effects affecting the search for exoplanets**
  - Instrumental systematics
  - Tellurics
  - Presence of other planets (in RVs), known or unknown

# Introduction: context and challenge

## Mass – Period Distribution



Radial velocity  
(projected) mass



Transits  
Radius

Indirect technique  
Stellar photons

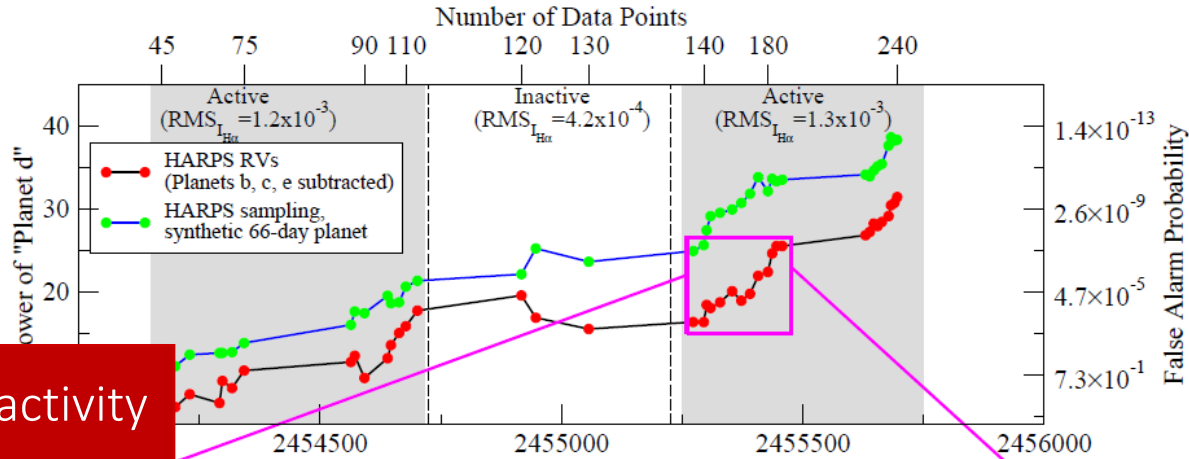
# Indirect detection methods

## Stellar variability can

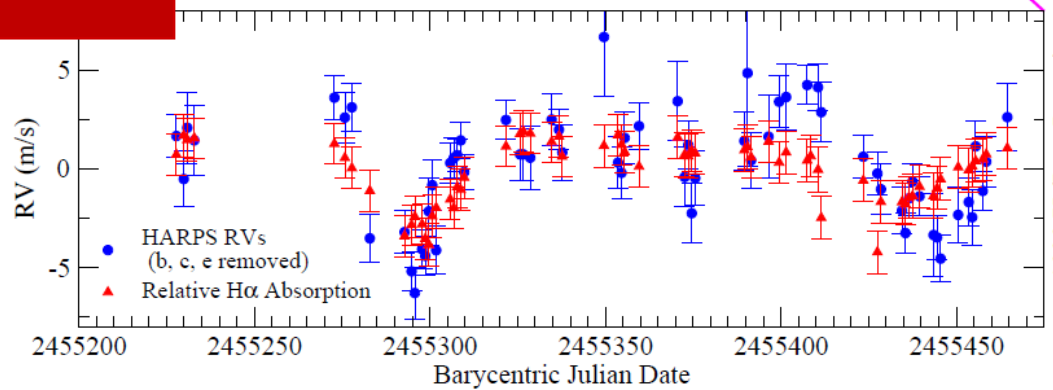
- *Mimic* the planetary signal (RV, atmospheric features)
- *Hide* the planetary signal
- *Affect* the determination of planetary parameters (mass, radius, atmosphere characterisation) / uncertainties, biases

# Gl 581 (M3)

Mayor+ 09  
4 planets !!!

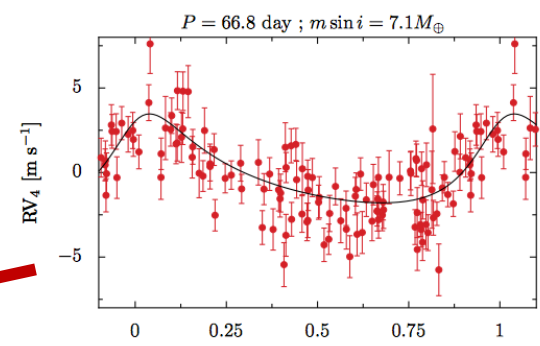
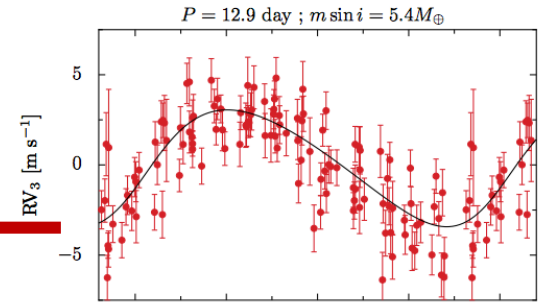
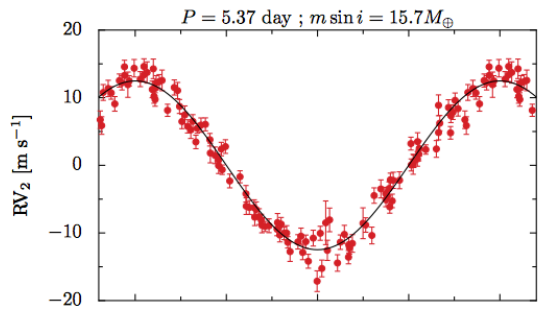
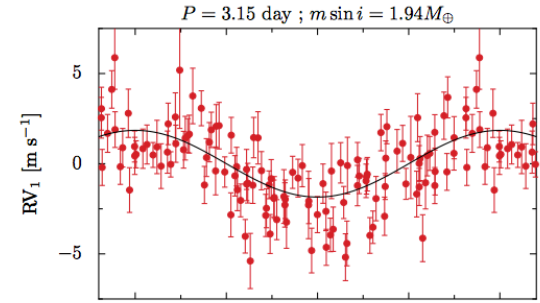


Importance of activity indicators



Robertson+ 14  
Re-analysis

Still controversial



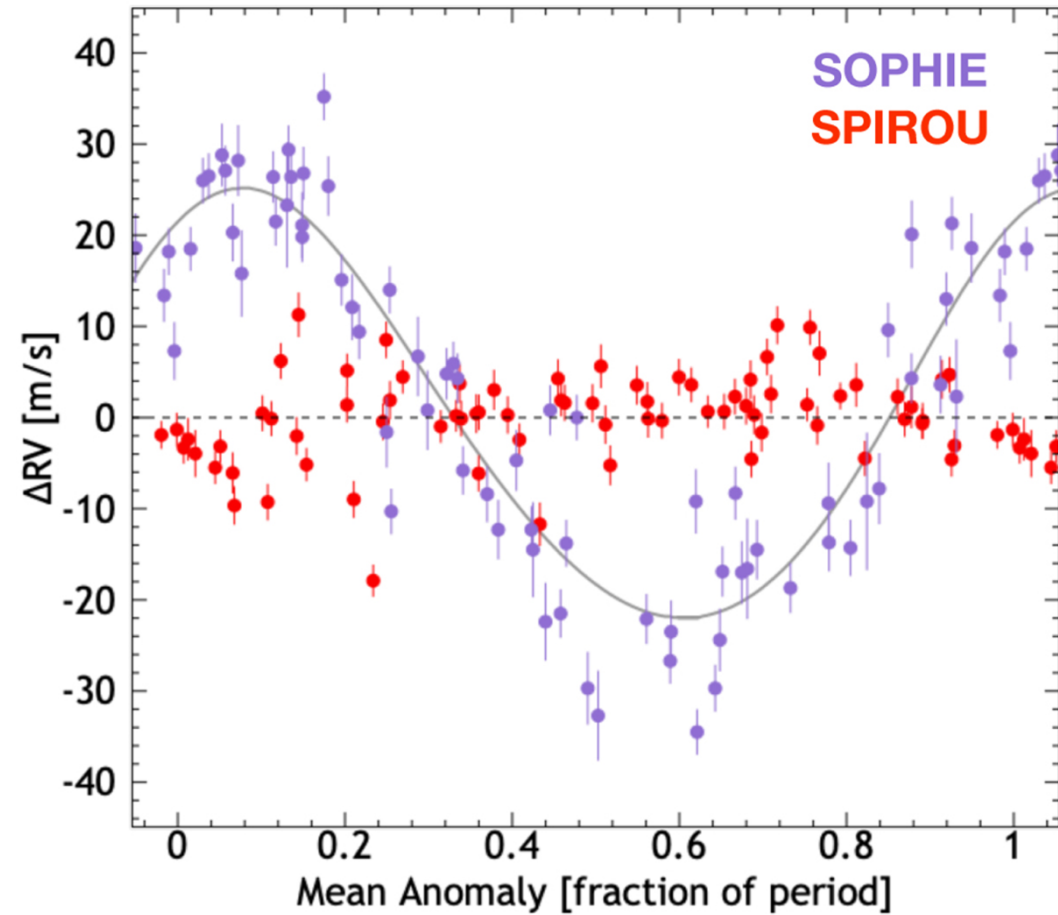
# AD Leo (M3)

Tuomi+18 claimed a planet based on VIS observations

Kossakowski+22 found link with various activity indicators

Carmona+23 rejected the planet based on IR observations

Importance of  
wavelength coverage



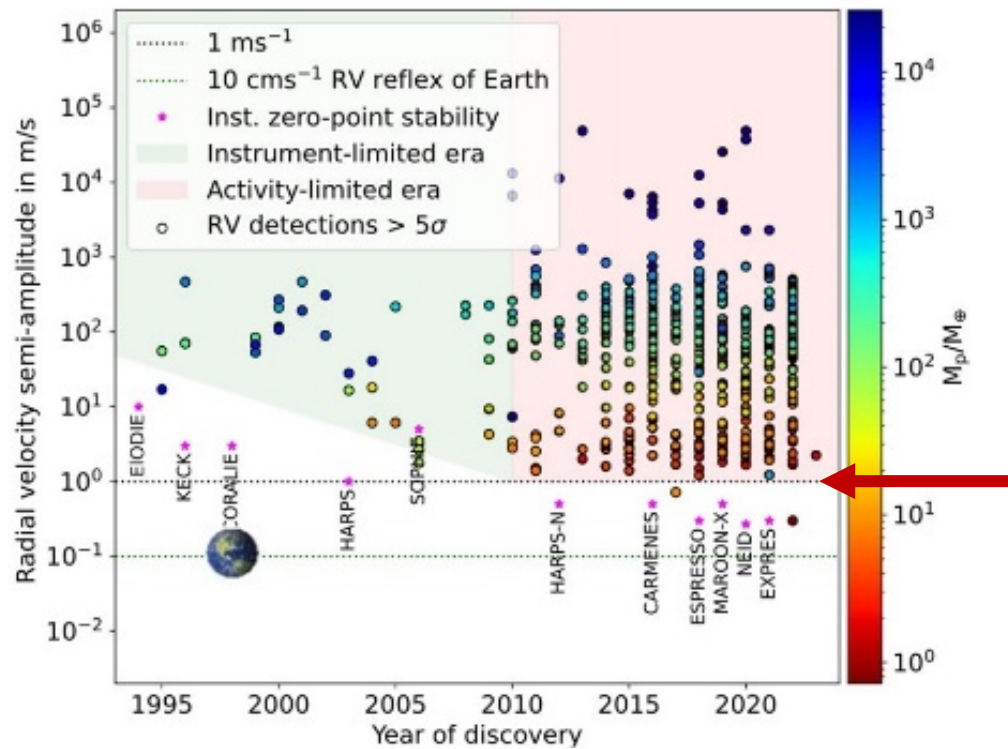
# Indirect detection methods

## Stellar variability can

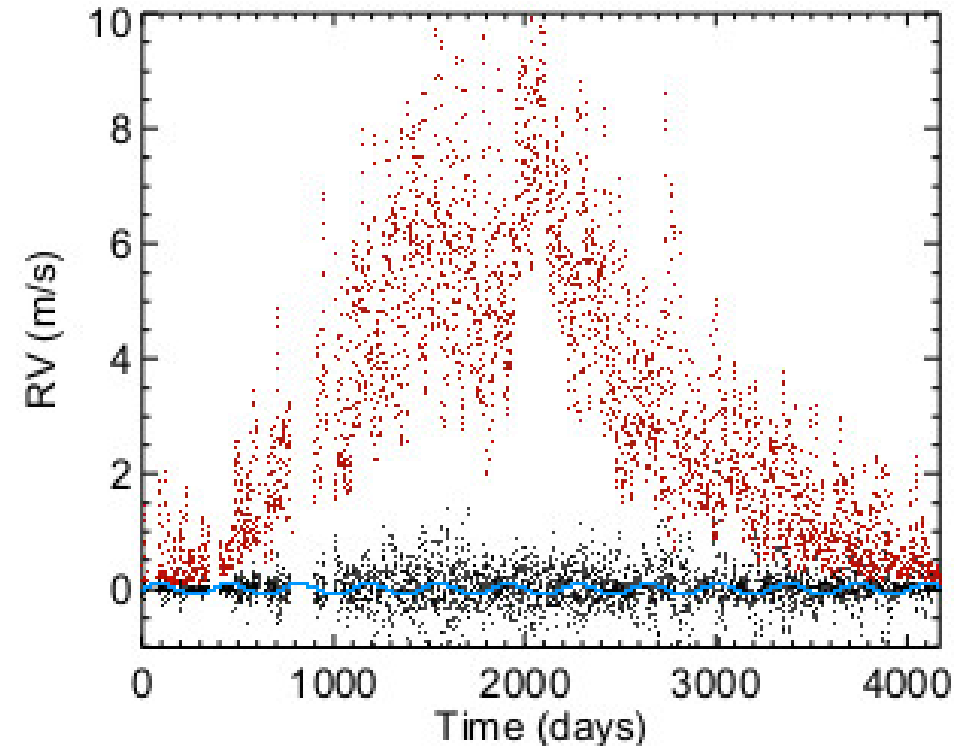
- *Mimic* the planetary signal (RV, atmospheric features)
- *Hide* the planetary signal
- *Affect* the determination of planetary parameters (mass, radius, atmosphere characterisation) / uncertainties, biases



# Main limitation to detect low mass planets

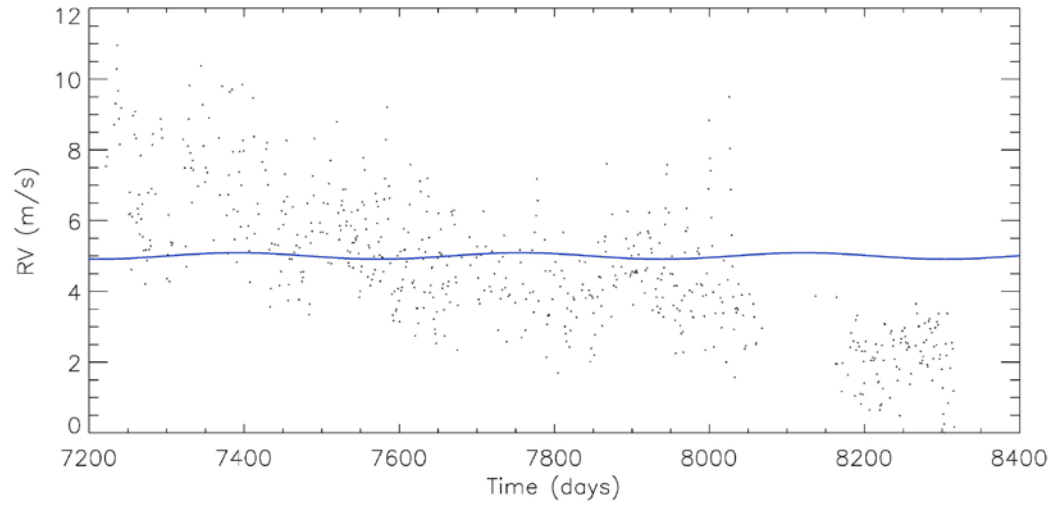


John+23

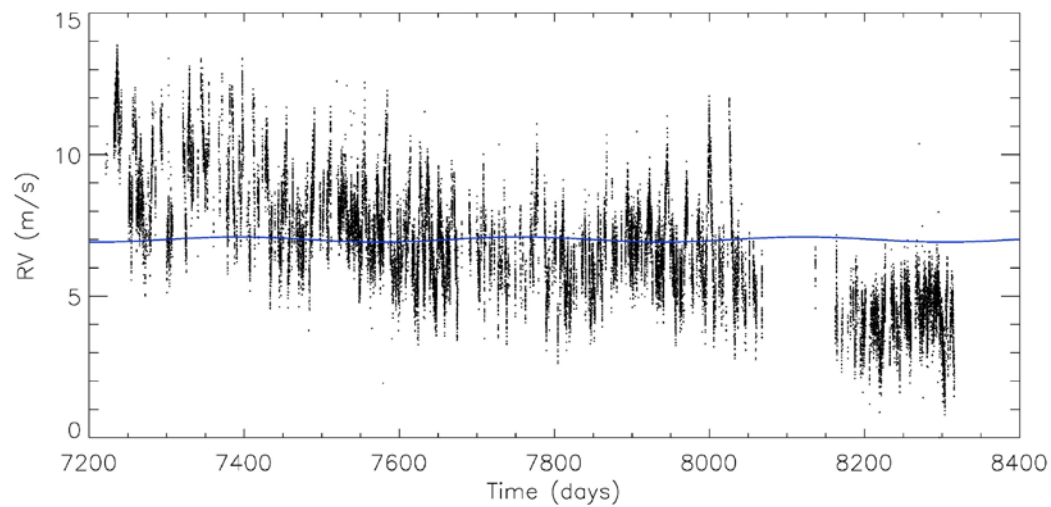


Meunier+10

# Solar HARPS-N data Dumusque+21



Daily averages



All individual observations (5 min averages)

# Indirect detection methods

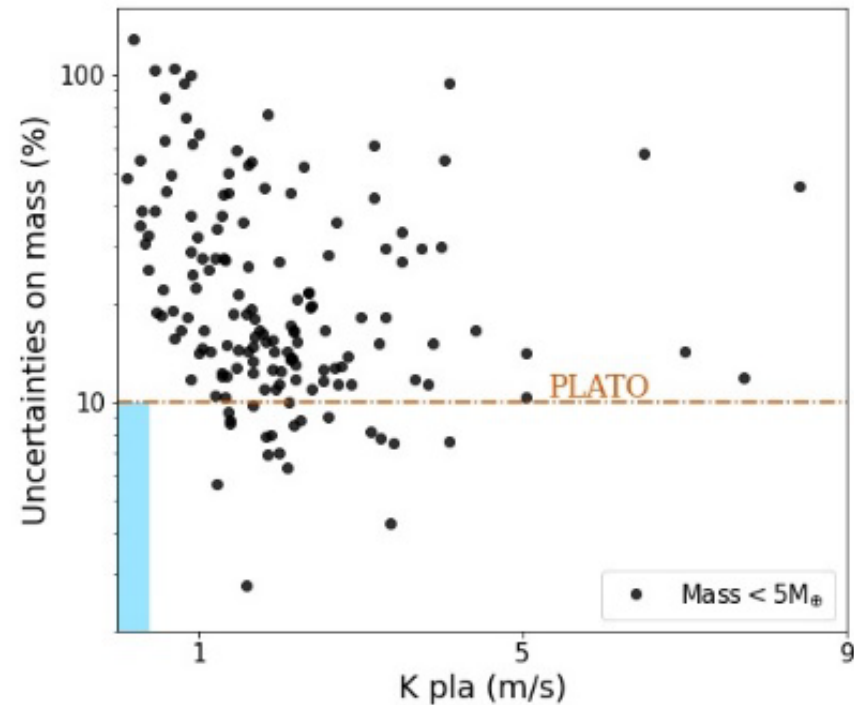
## Stellar variability can

- *Mimic* the planetary signal (RV, atmospheric features)
- *Hide* the planetary signal
- *Affect* the determination of planetary parameters (mass, radius, atmosphere characterisation) => uncertainties, biases

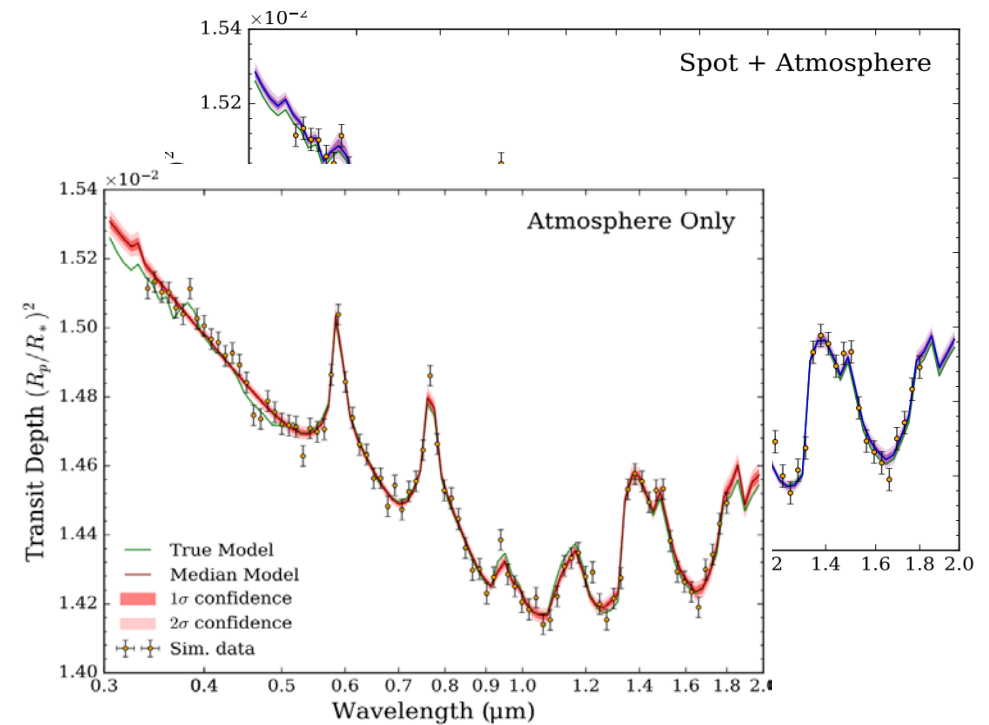
# Impact on exoplanet characterisation

*On mass estimation*

M < 5 M<sub>Earth</sub>  
From <https://exoplanet.eu/>



*On atmosphere characterisation*



Rackham+22

# Part 1: Stellar variability

## Magnetic activity

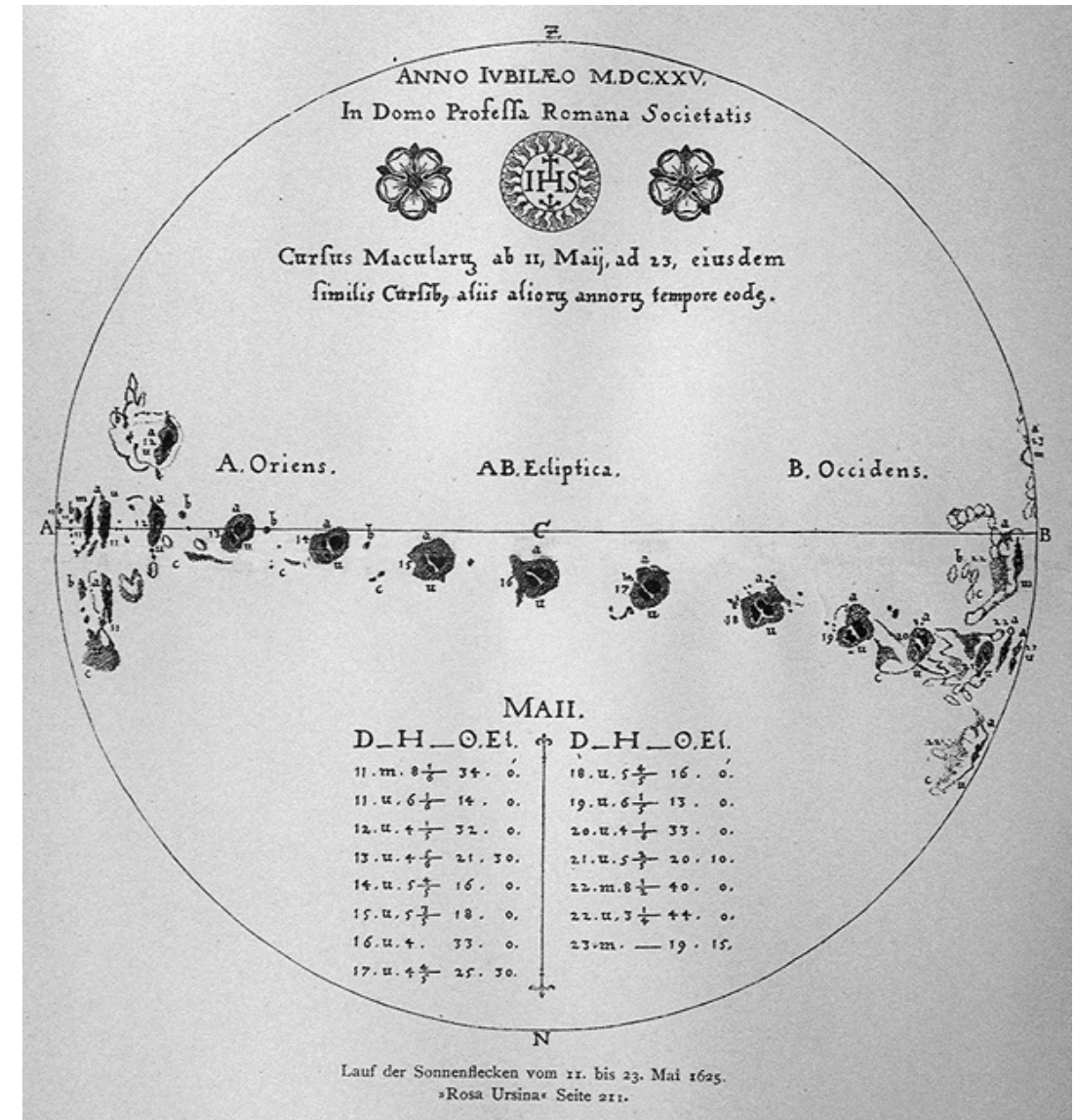
- Intensity observations
- Chromospheric emission
- Dynamo and magnetic fields : spots, faculae, flares

## Flows

- Differential rotation
- Oscillations/pulsations
- Granulation
- Supergranulation, meridional circulation, convective blueshift inhibition

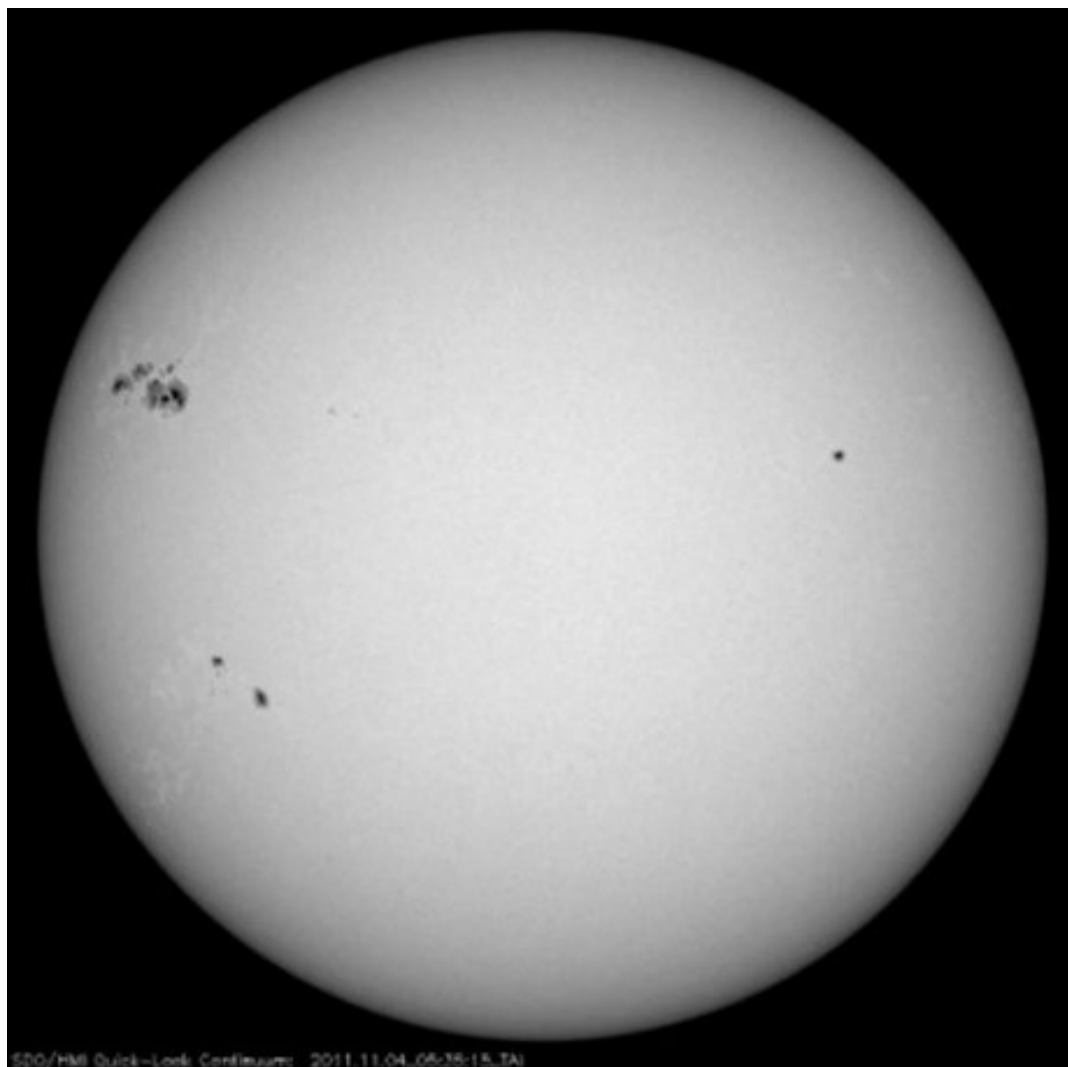
*Lot's of information from the Sun*

*Focus on interesting properties for exoplanet searches and characterisation*

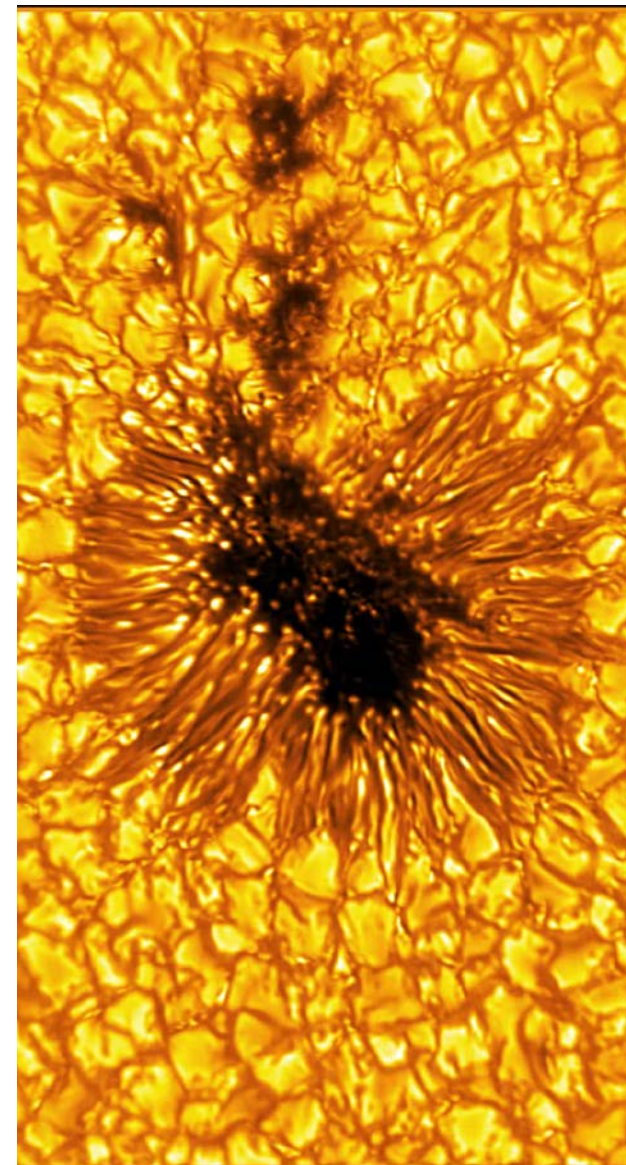


Scheiner 1625

# Spots and faculae

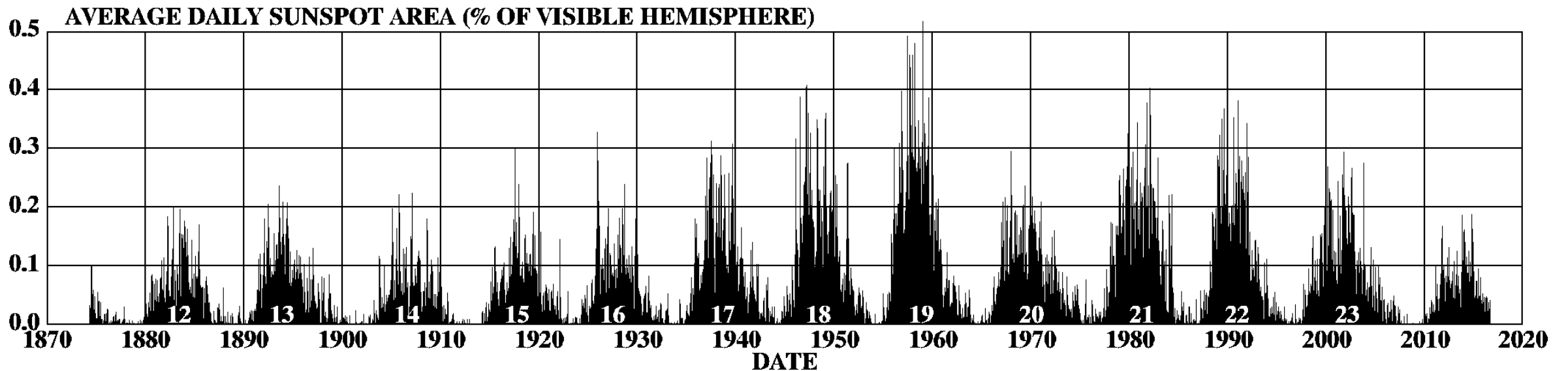
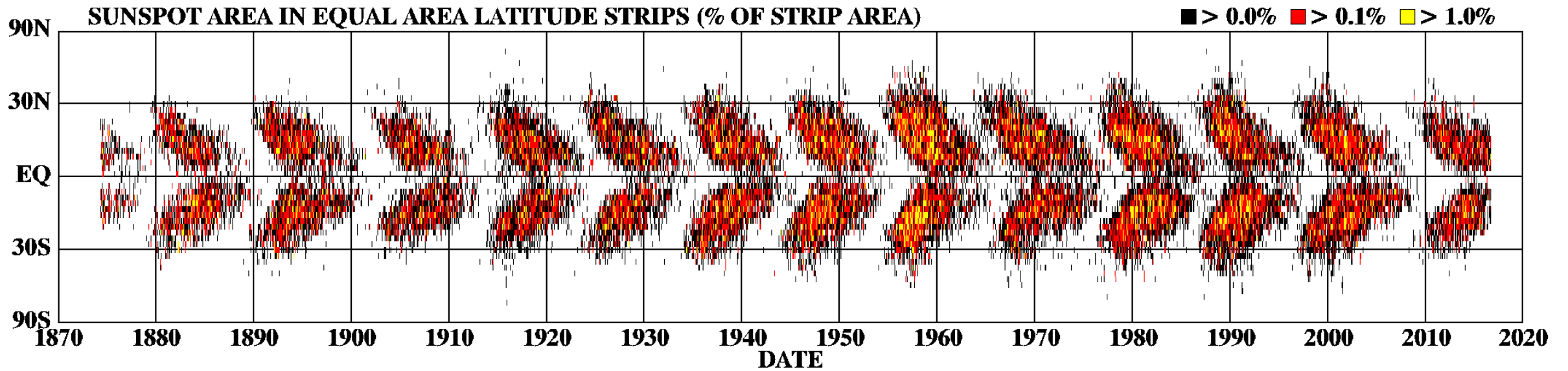


SDO/HMI

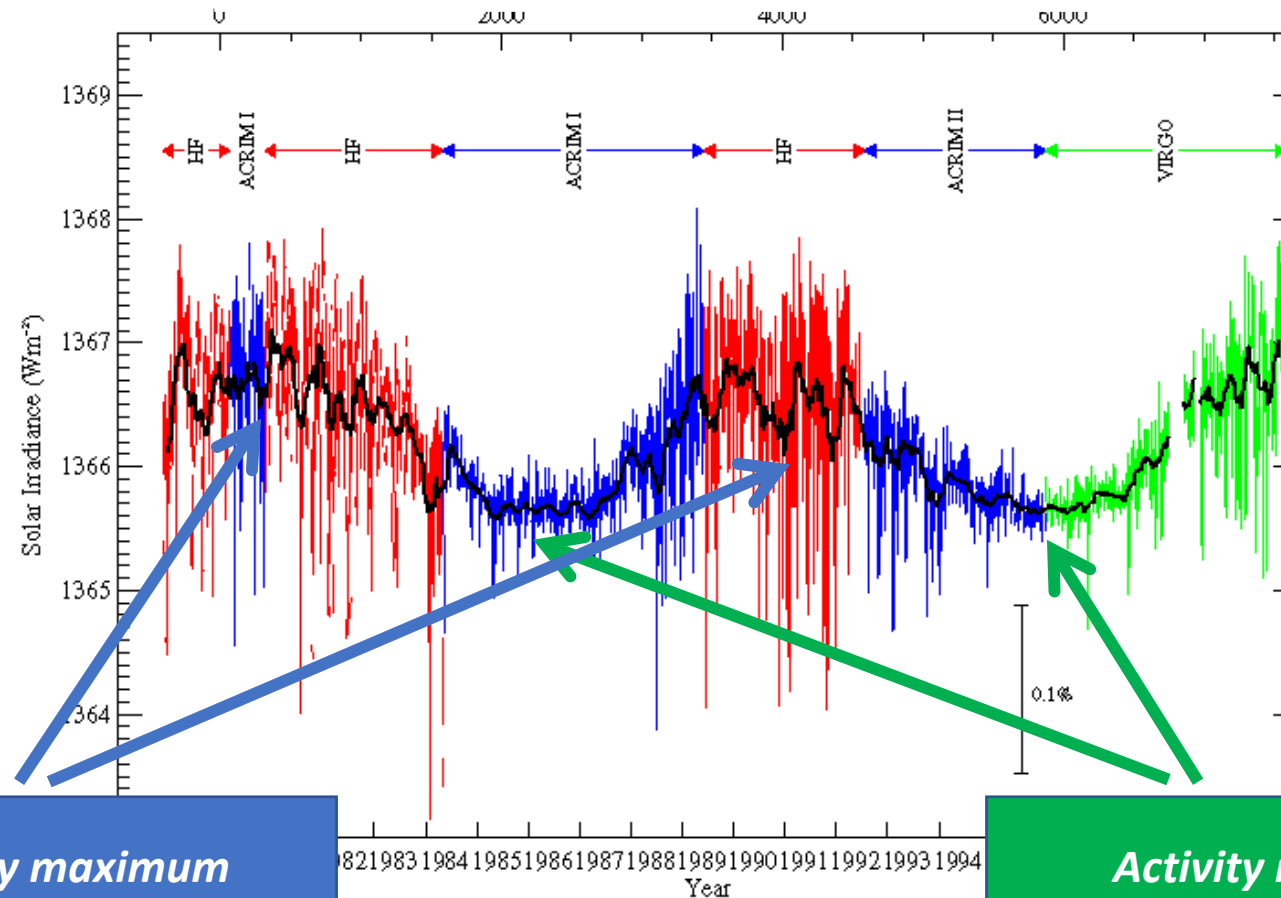


D.K.Inouye telescope, Maui  
photosphere

# DAILY SUNSPOT AREA AVERAGED OVER INDIVIDUAL SOLAR ROTATIONS

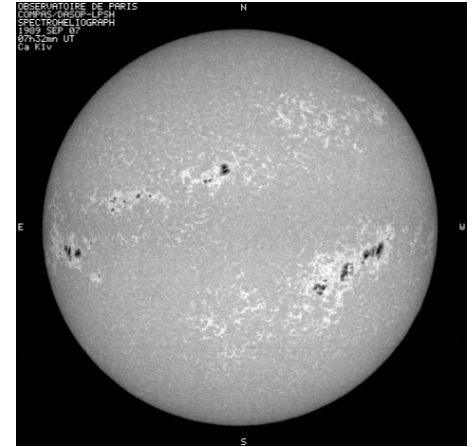


# Solar irradiance variability



**Activity maximum**  
*More spots and faculae*

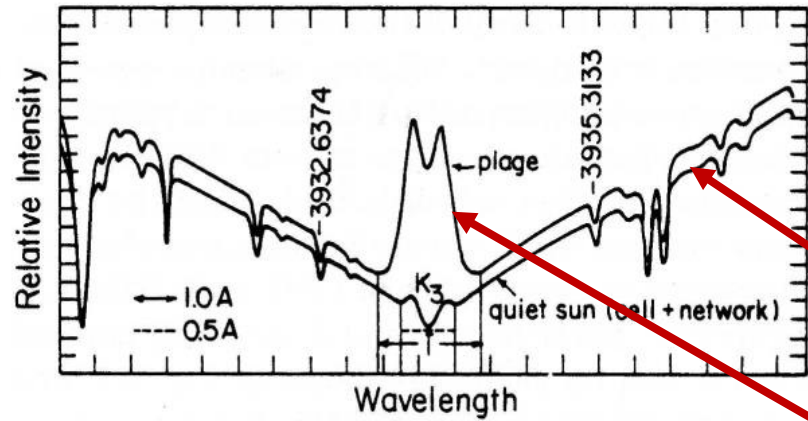
**Activity minimum**  
*Less spots and faculae*



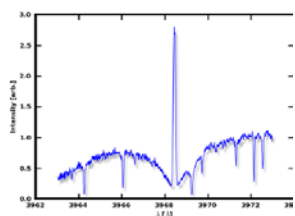
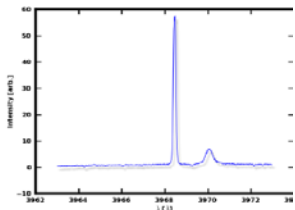
from: C. Frohlich, Space Science Reviews, in preparation, and the VIRGO Team (Dec 03, 2003)



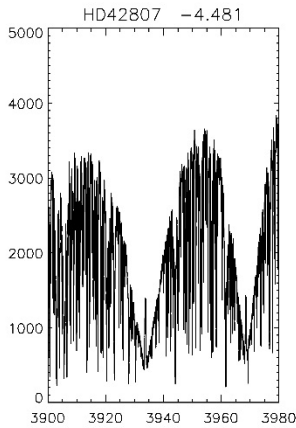
# The Ca II H&K lines at $\approx 3933$ and $3968 \text{ \AA}$



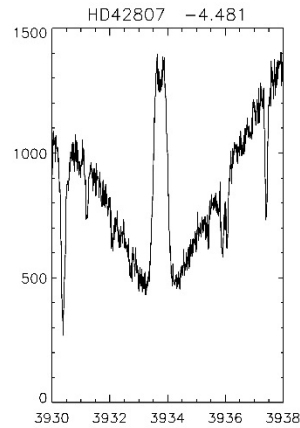
Ca II H&K



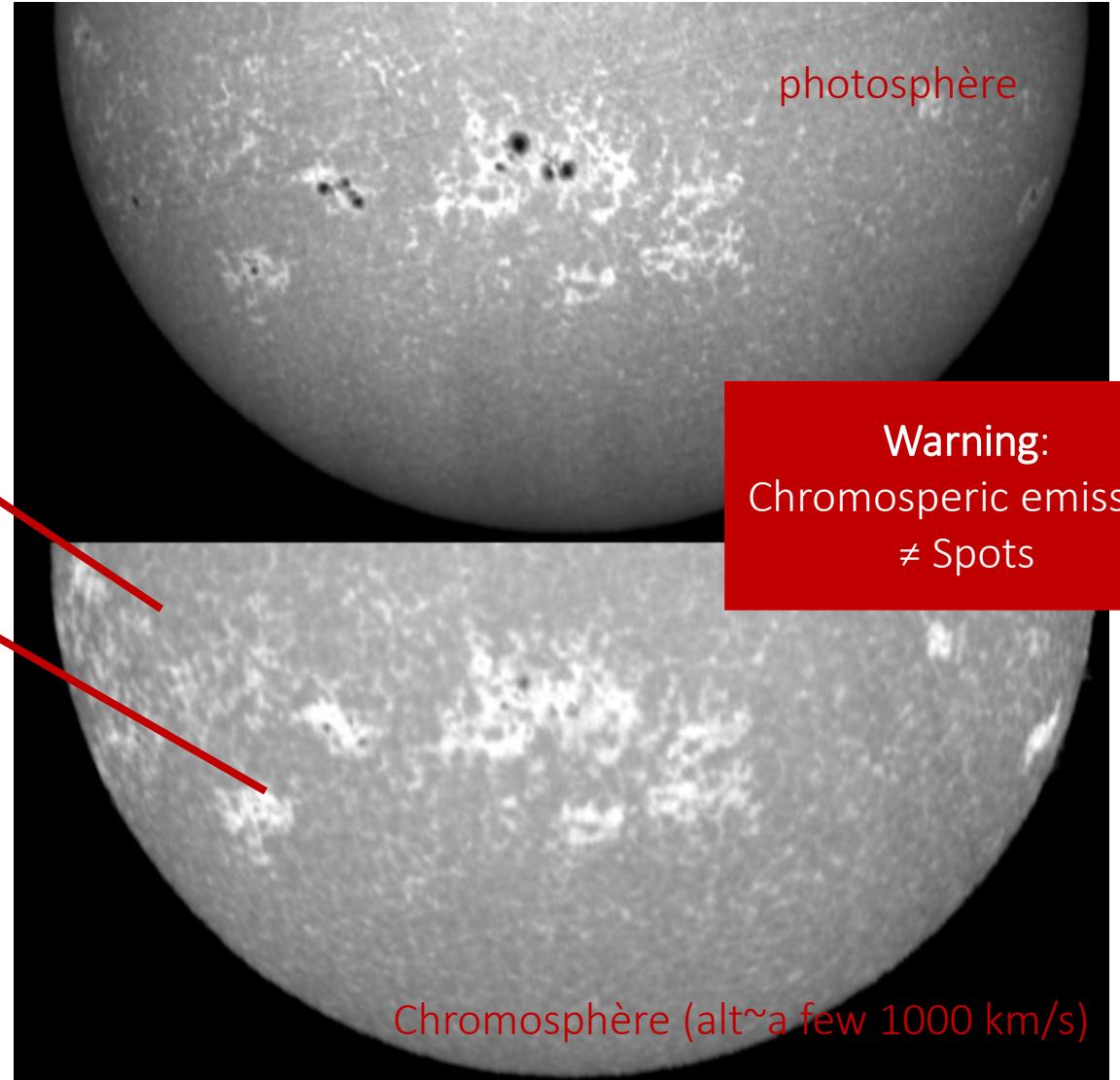
Active M dwarf



G dwarf



HARPS data



Warning:  
Chromospheric emission  
≠ Spots

Meudon/BASS2000

# The $\text{LogR}'_{\text{HK}}$ indicator

**S-index** = integrated **line core emission** of Ca II H et K relative to **average continuum**

- Usually with a calibration factor depending on instrument
- Color-dependent

**Two calibration steps** => for comparison between stars

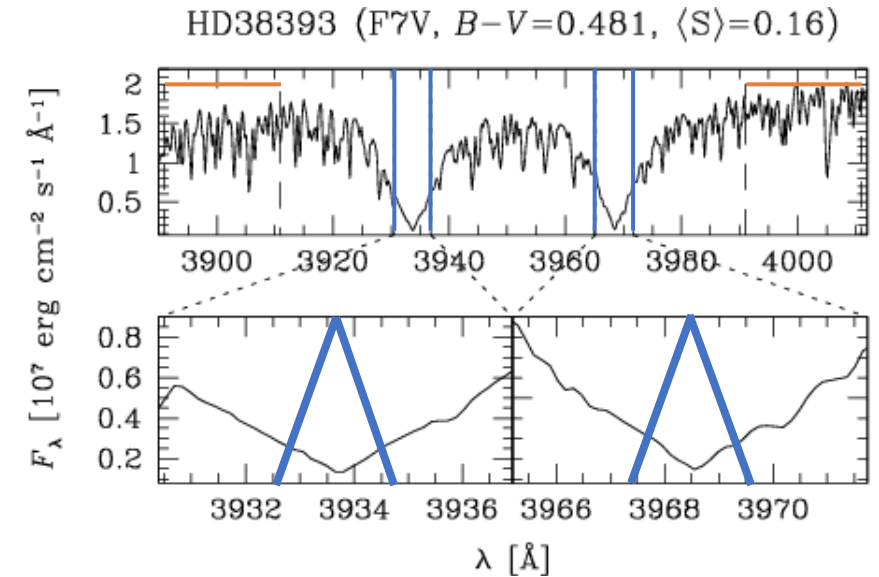
- **Photospheric contribution** (calibration vs B-V, [Noyes 84](#) FGK stars ; [Astudillo-Defru+16](#) M stars)  $\rightarrow$  flux  $R_{\text{HK}}$
- **Bolometric flux** (calibration vs B-V [Noyes 84](#))  $\rightarrow R'_{\text{HK}} \rightarrow \text{LogR}'_{\text{HK}}$

**Recent complementary approach**

- Use of more information from the whole line cores [Crétignier+23](#)

**Other chromospheric indices**

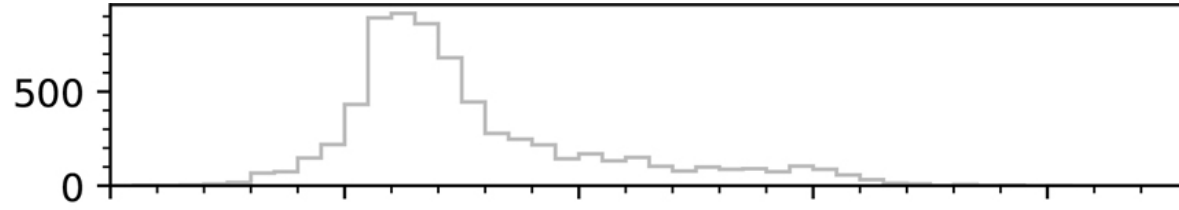
- $\text{H}\alpha$ , Na doublet, Ca IR triplet, He I 10830, UV lines...



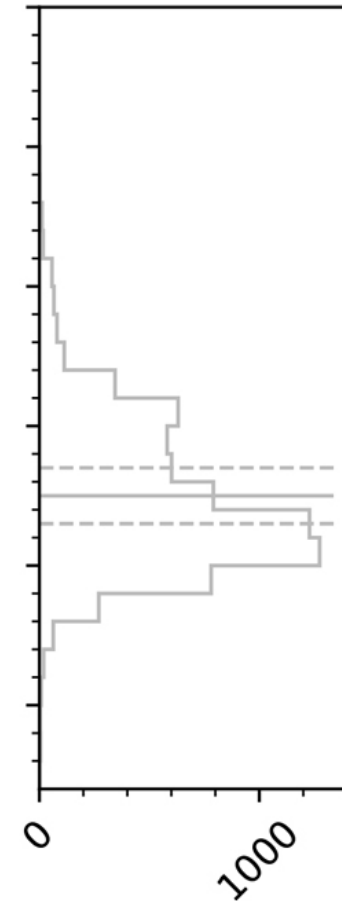
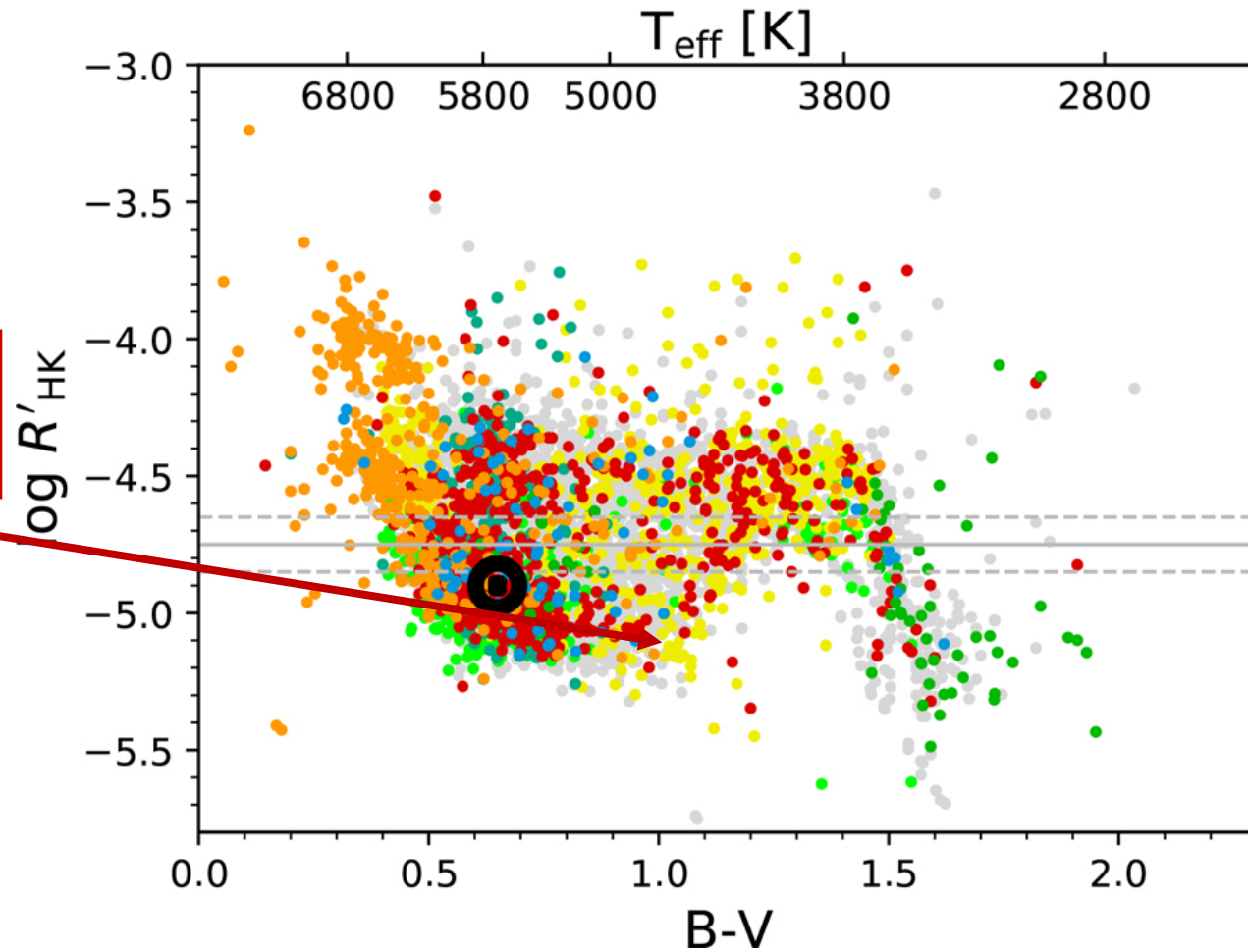
[Cincunegui+ 07](#)  
Based on Mount Wilson survey e.g. [Baliunas+95](#)

**Warning:** not always equivalent, especially with  $\text{H}\alpha$  ([Cincunegui+07](#), [Meunier+22,24](#), [Gomes da Silva+14,22](#))

# Average activity levels

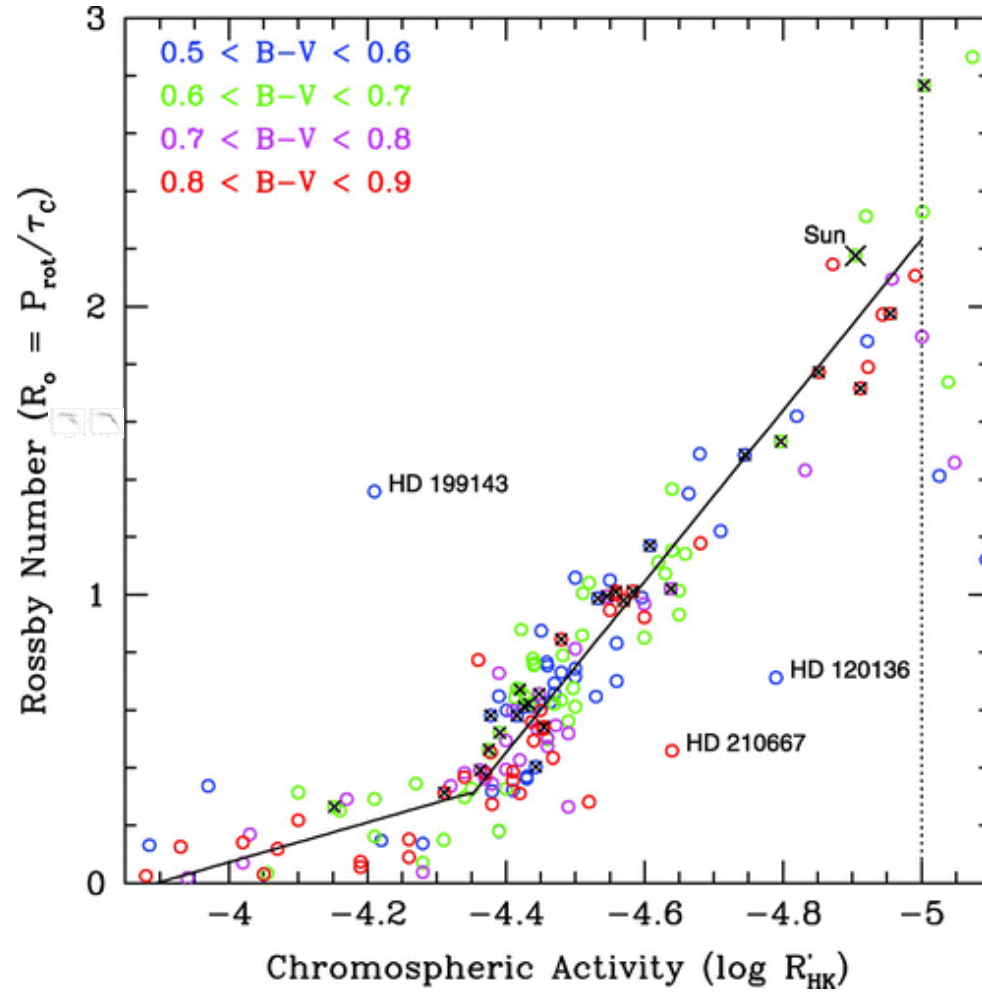
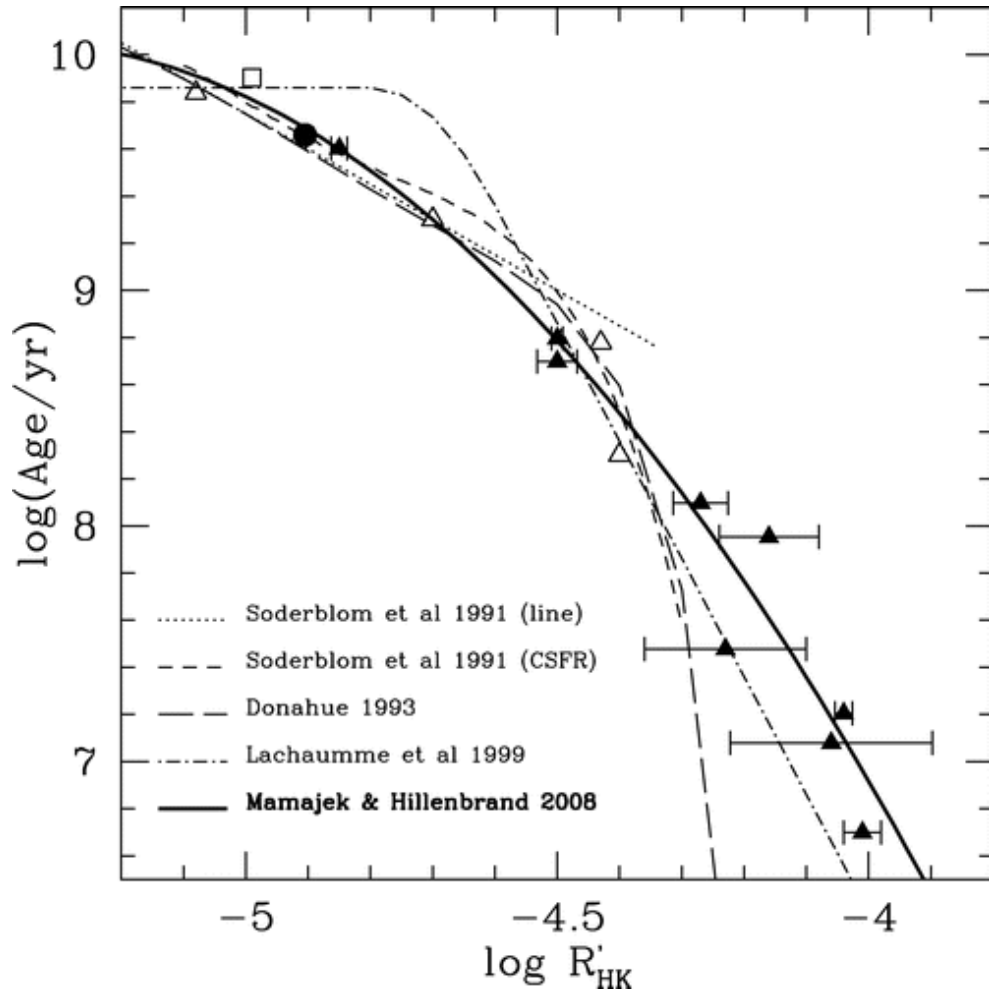


Boro Saikia+18  
+ see previous works  
Gray+03,06,Mittag+13...

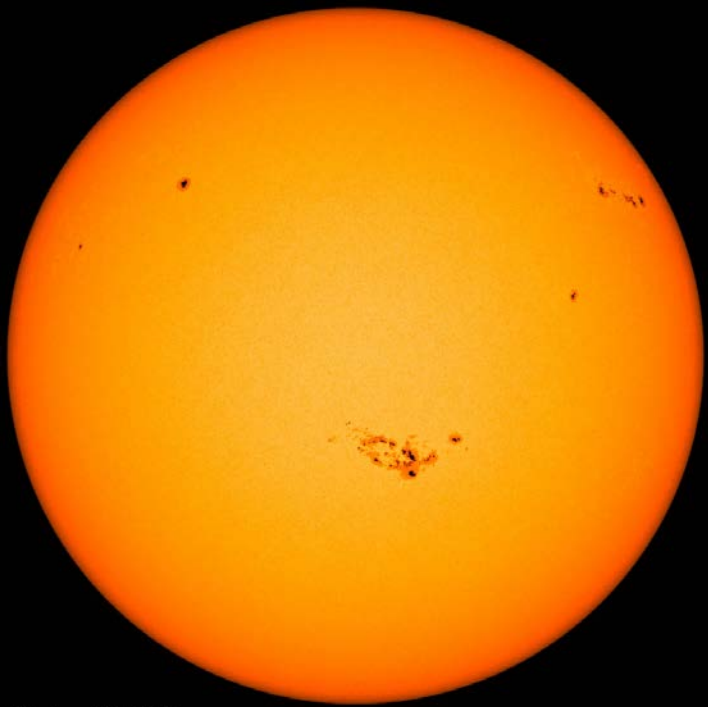


Warning: 2 definitions  
of « basal » flux

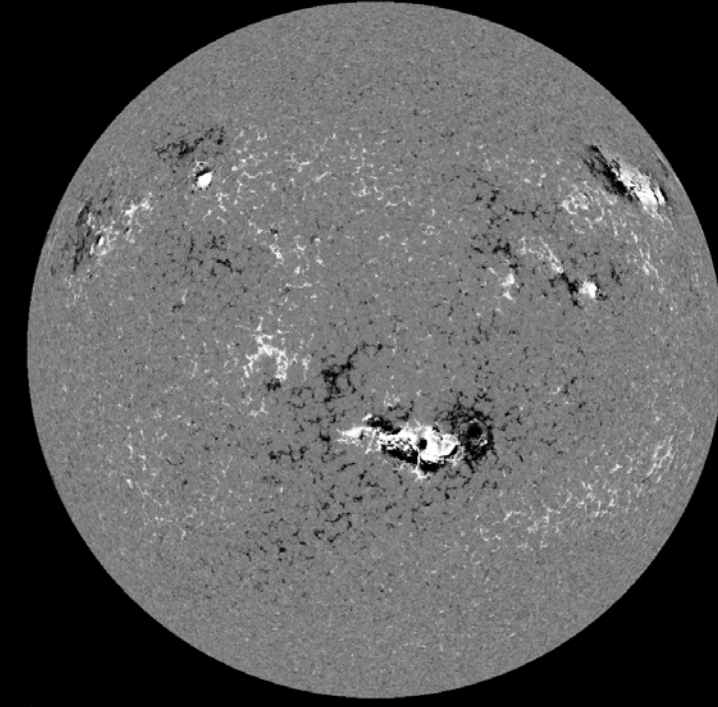
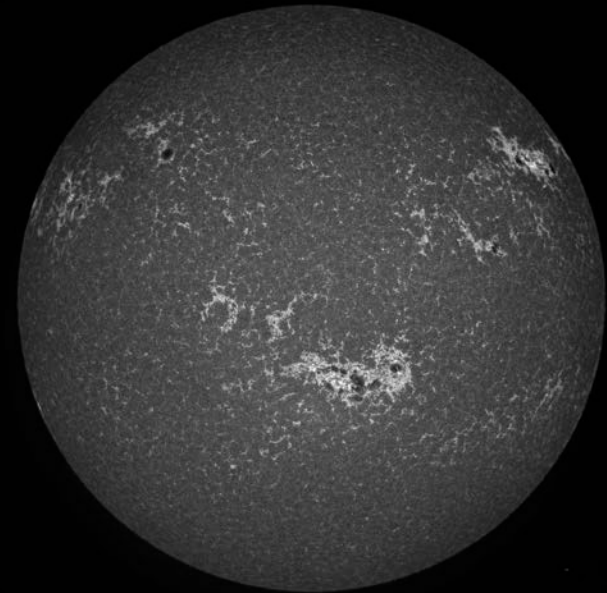
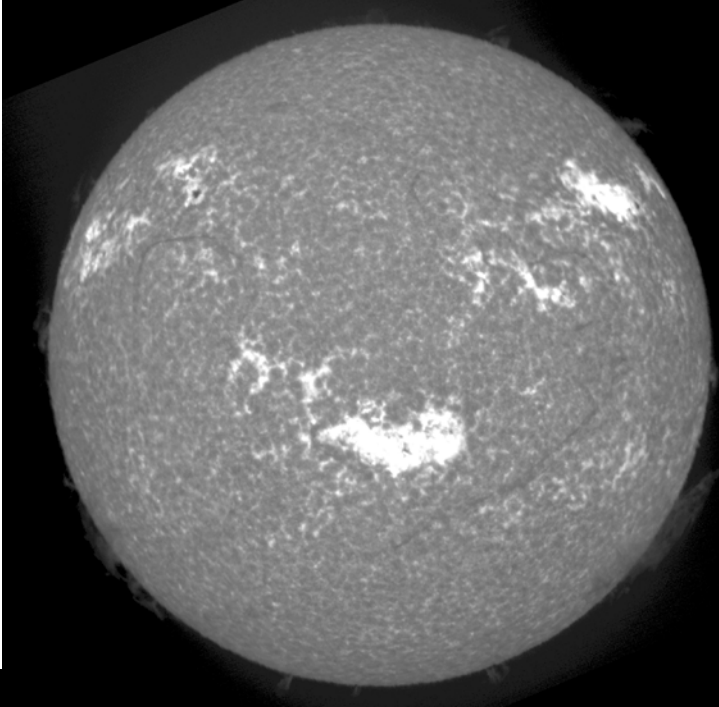
# Age-Activity-Rotation relationship



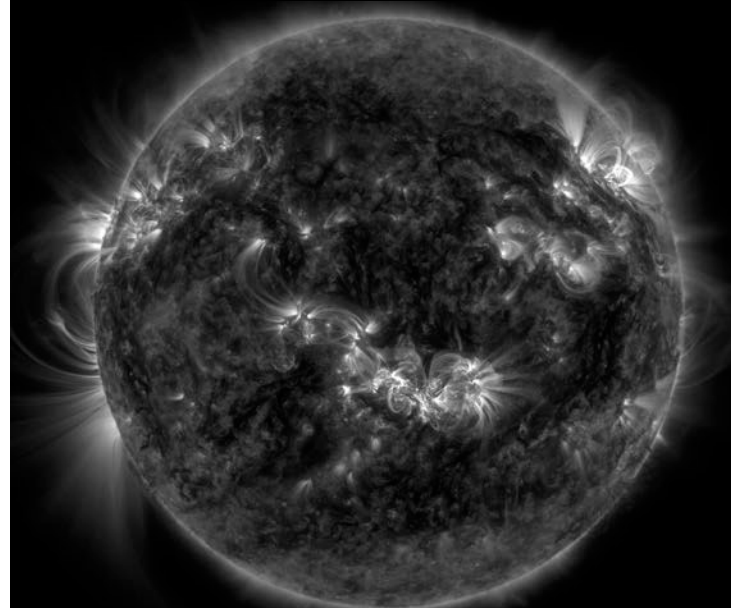
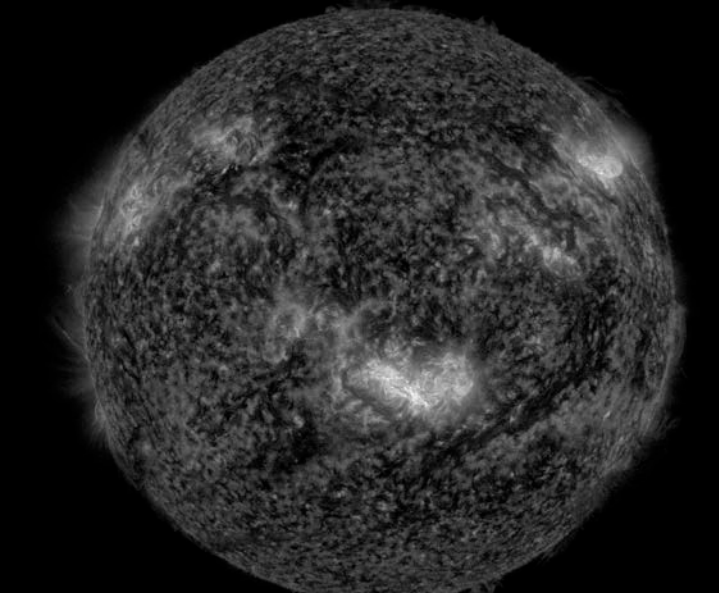
Mamajek&Hillebrand 08



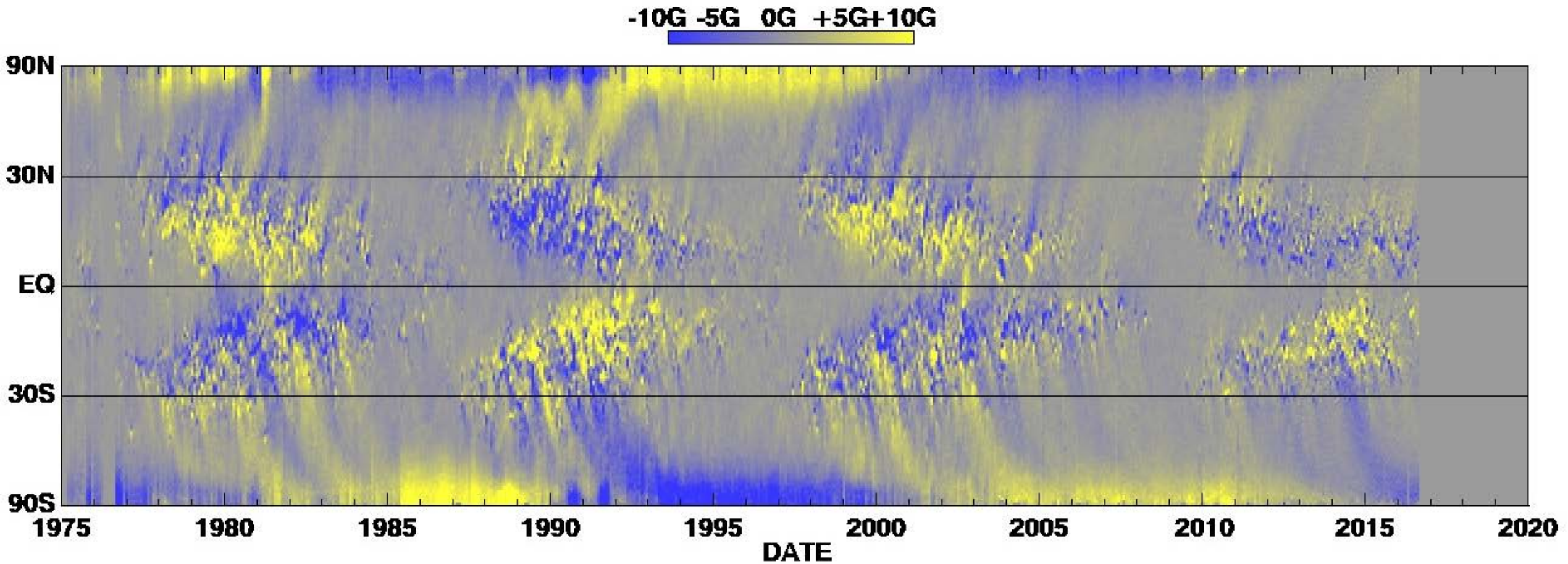
SDO/HMI Continuum: 20240508\_000000



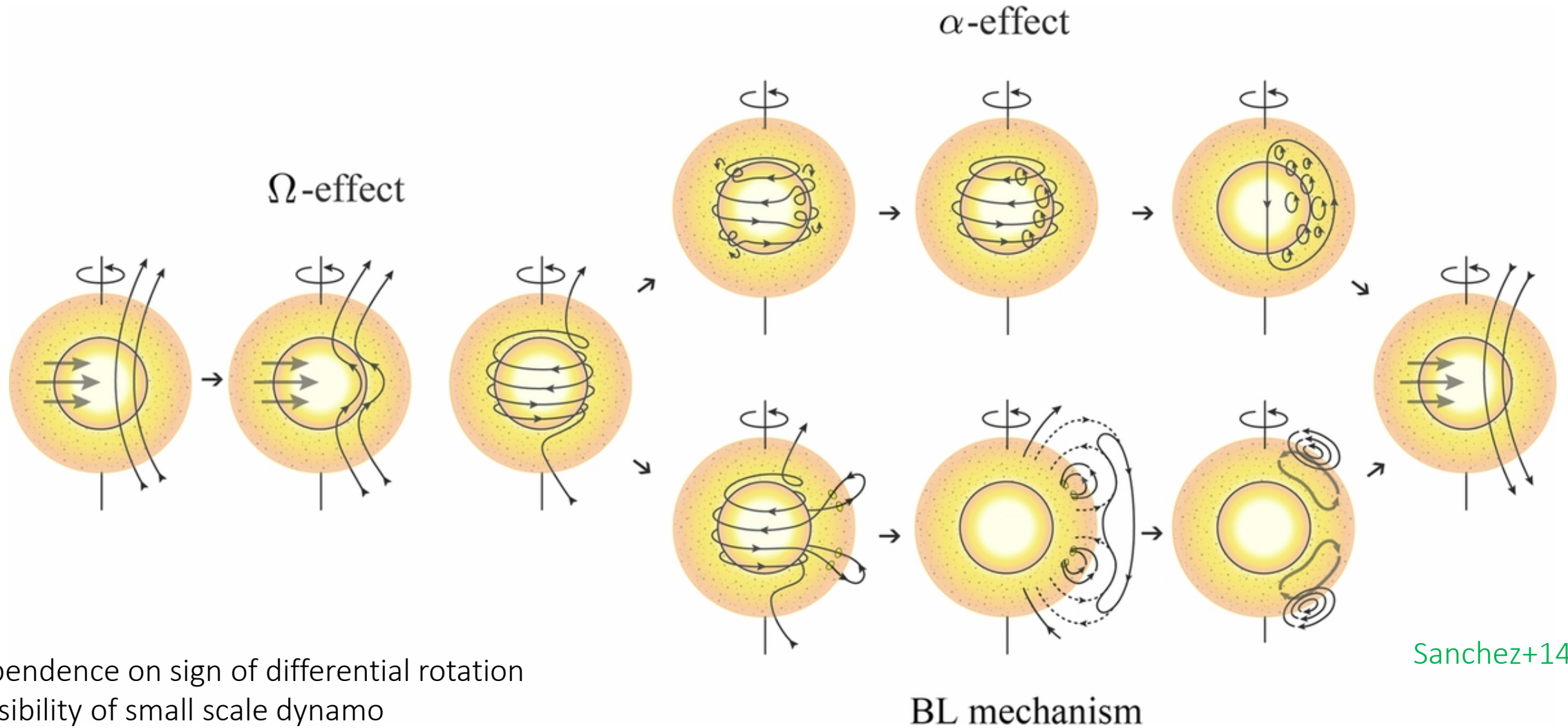
SDO/HMI Magnetogram: 20240508\_000000



# Magnetic butterfly diagram



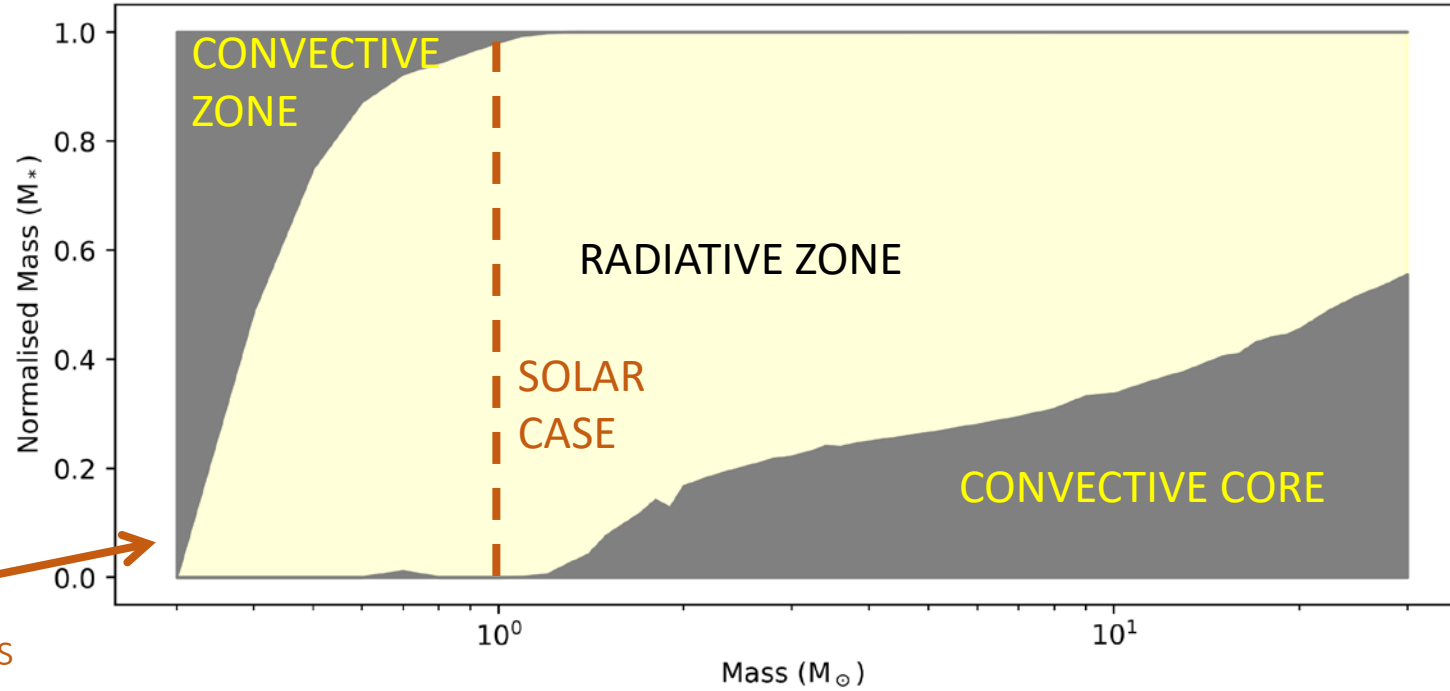
# Solar large-scale dynamo



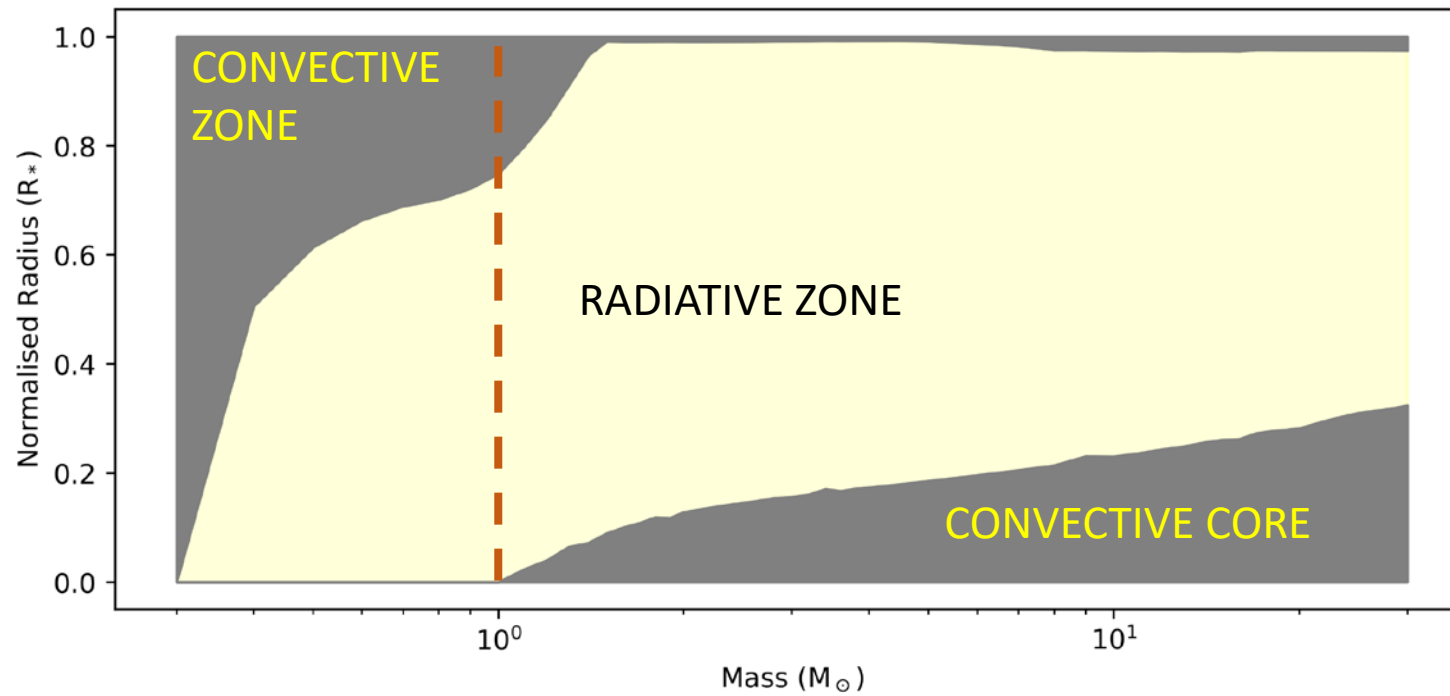
Dependence on sign of differential rotation  
Possibility of small scale dynamo  
See for example [Brun+17](#)

Sanchez+14

• Mettre fig



Fully convective M dwarfs  
Masses  $< \sim 0.35 M_\odot$

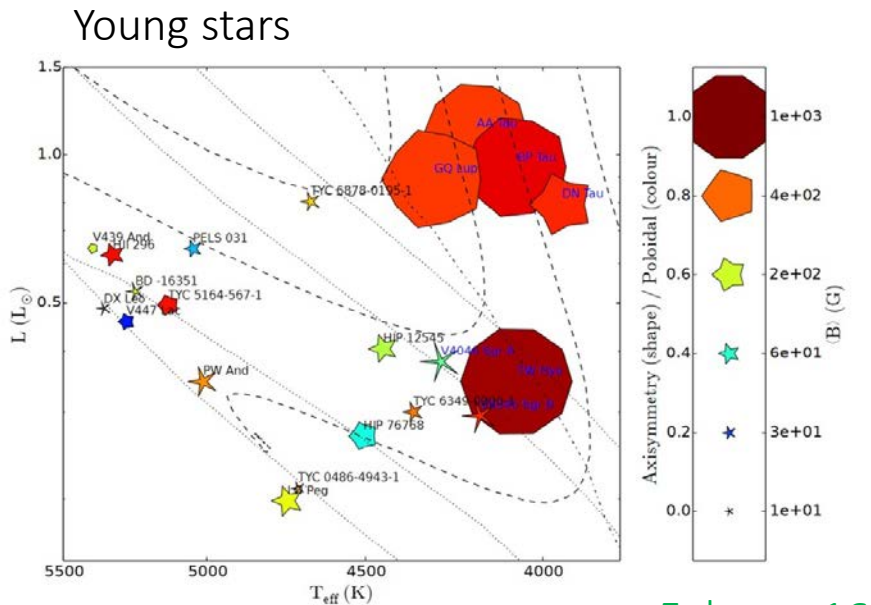


Adapted from Amard+19  
Brun et al 24



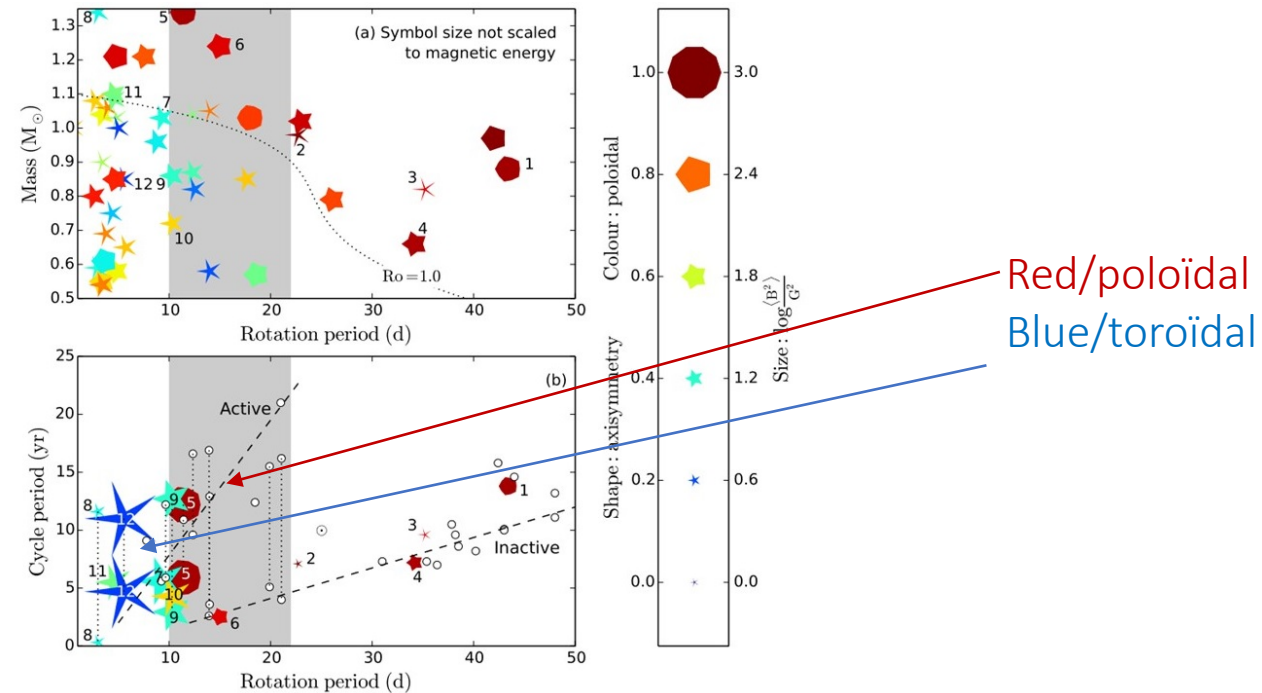
# Some trends but strong diversity

- Zeeman-Doppler Imaging => large-scale fields (cancellation of opposite polarities)
- Zeeman broadening => small-scale fields ( $B > B_{ZDI}$ )



Size:  $B$  strength  
Color: red/poloïdal, blue/toroïdal  
Shape:  $B$  topology (circular = axisymmetric)

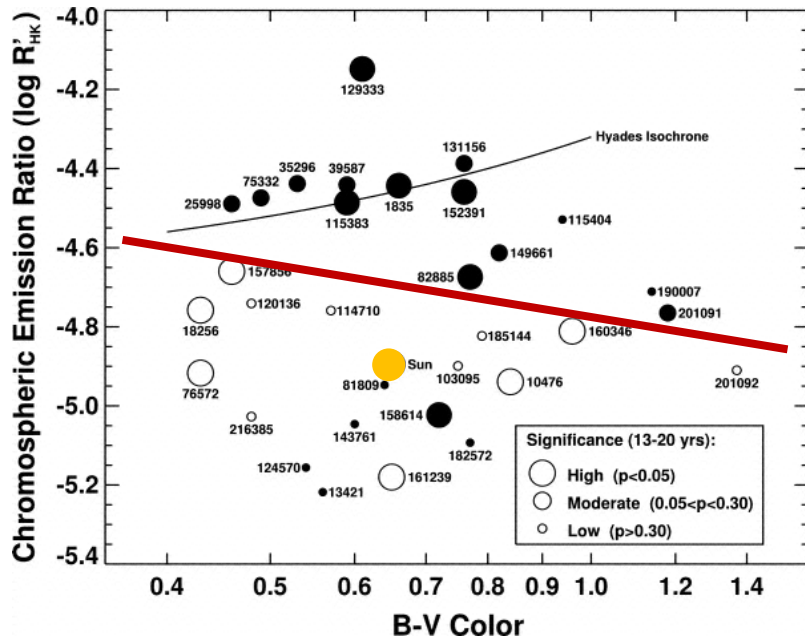
Folsom+16



Shape:  $B$  topology (circular = axisymmetric)

See+16

# Spots & faculae: contrasts

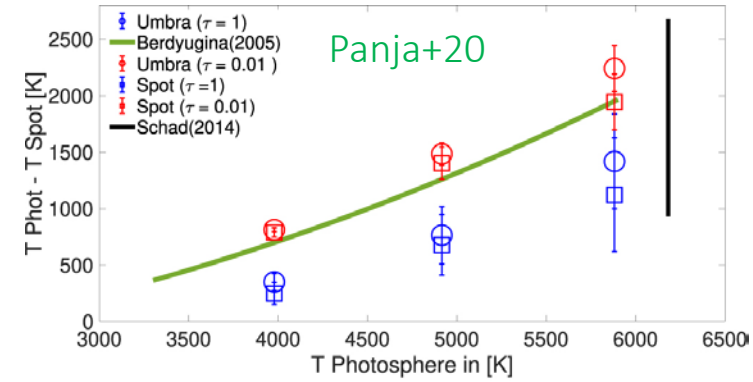
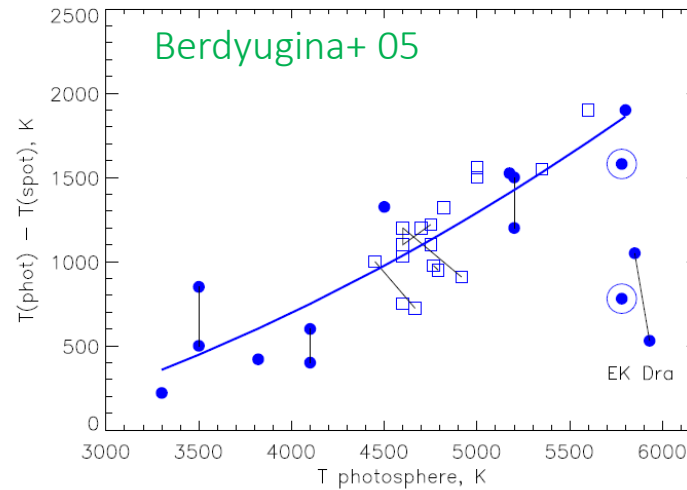


Young MS stars

Old MS stars

Lockwood+ 07 (Radick+98,18)

Inclination may bias the correlations Meunier+19



## Spots

- Contrast increases with Teff
- From observations
- From models: Panja+20
- Low T => impact on molecules

## Plages

- Contrast depends on spectral type
- Strong B,  $\mu$  dependence ( $\sim 15\%$  at the limb, dark in IR)

Norris+16,23, Witzke+22

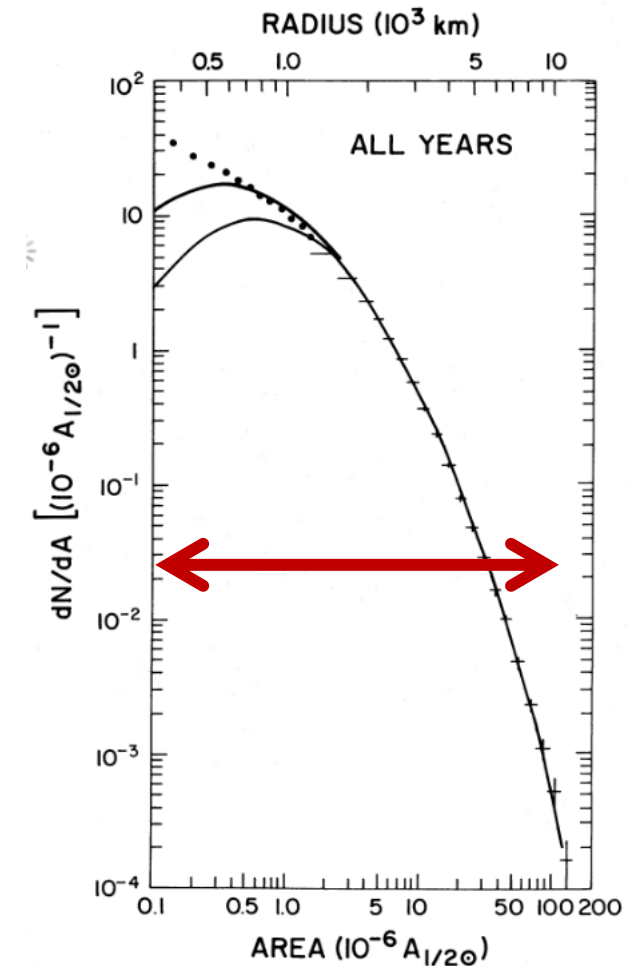
# Spots & faculae: sizes & lifetimes

## Size ?

- $\sim$ log-normal distribution for the Sun
- A few publications for other stars but do not take into account the degeneracies (size/contrast/number, spot/plage)
  - [Walkowicz+13](#), [Basri+18](#), [Luger+21](#) about intrinsic degeneracies
- Never clear if large spot or pack of small spots
- Umbra/Penumbra ratio for other stars?

## Lifetime ?

- Larger solar structures last longer
- Expected to be longer for low  $T_{\text{eff}}$ 
  - Smaller convection level  $\rightarrow$  slower decay
  - Hint of agreement with theory for F-K stars ? [Giles+16](#)
- M stars: large diversity, but some cases with very stable pattern  $>1-2$  y compatible with low granulation level
- Observed light curves: Strong degeneracies as well ([Basri+22](#))



[Bogdan+88](#)

**Warning:** finite lifetime impact peaks at  $P_{\text{rot}}$  in periodograms

# A few reviews of interest for the Sun

- Solanki03
- Berdyugina05
- Solanki+06
- van Driel-Gesztelyi +14
- Brun+17

# Flares

## Energetic events

- Usually associated to active regions
- Due to magnetic reconnection
- Strong release of energy => electromagnetic radiation at all wavelengths and high energy particles (proton, electrons)

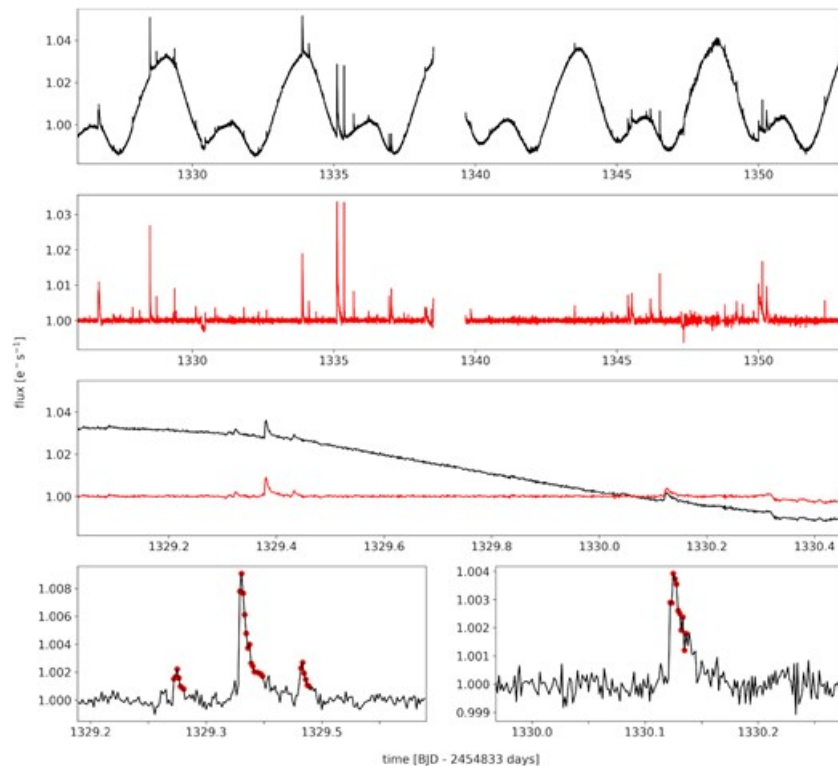
Sometimes associated to coronal mass ejections



# Many observations of (energetic) stellar flares

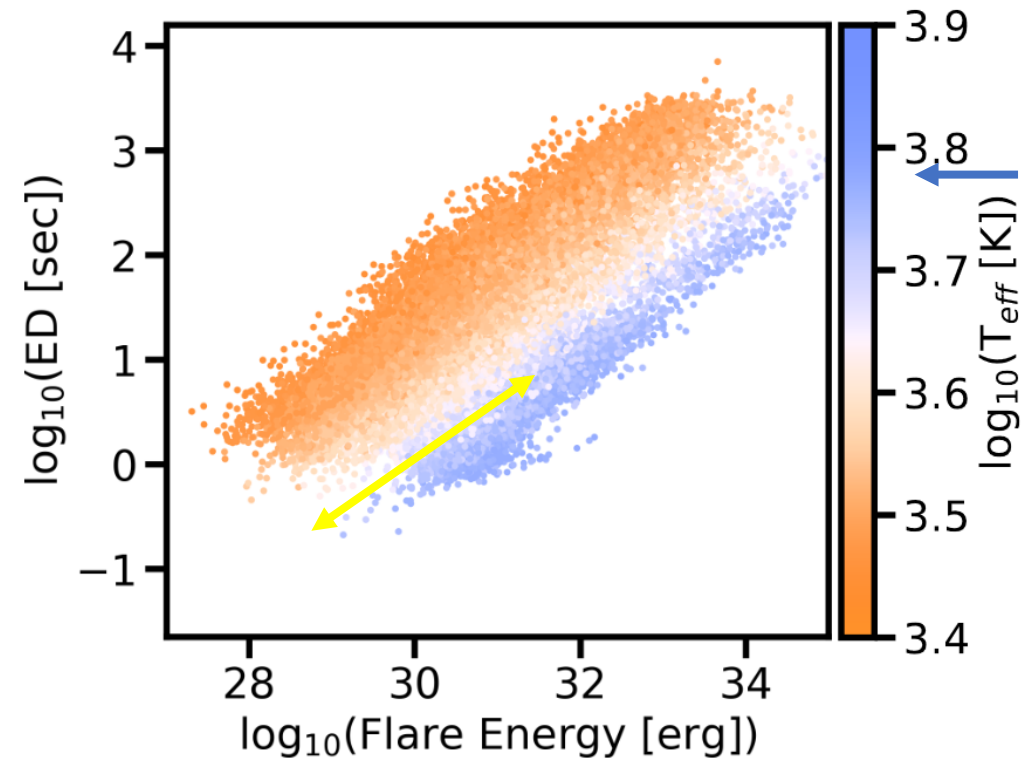
Example of AU Mic (TESS)

Ilin & Poppenhaeger 2021



Statistics TESS, GKM stars age < 300 Myr

Feinstein et al 2024



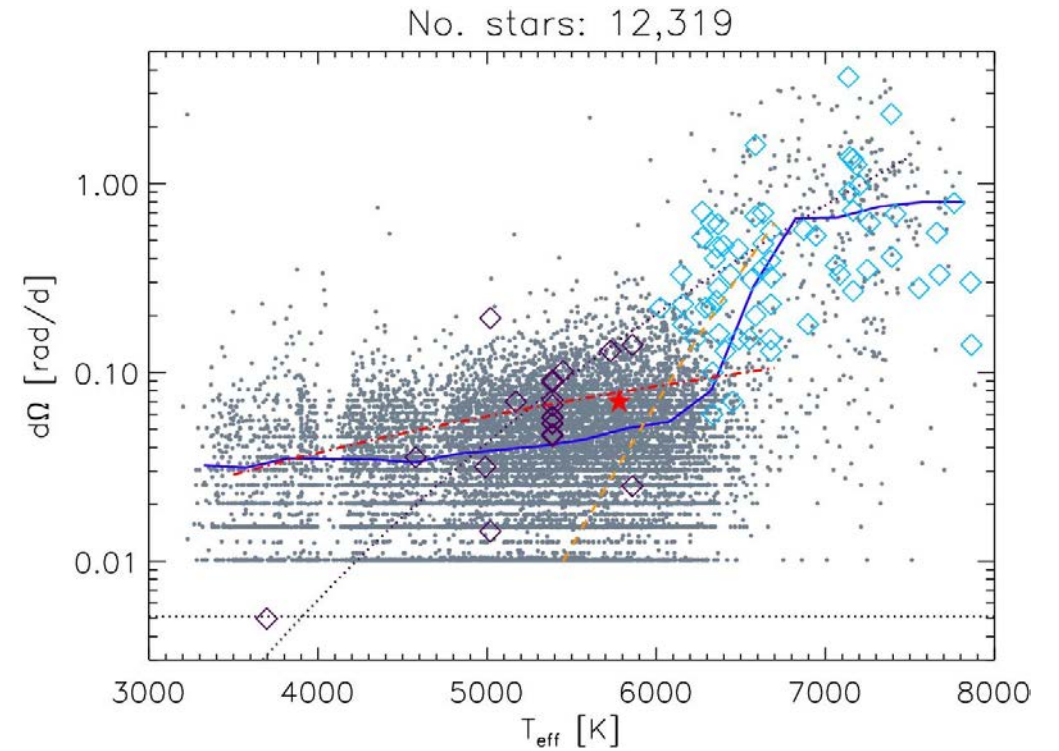
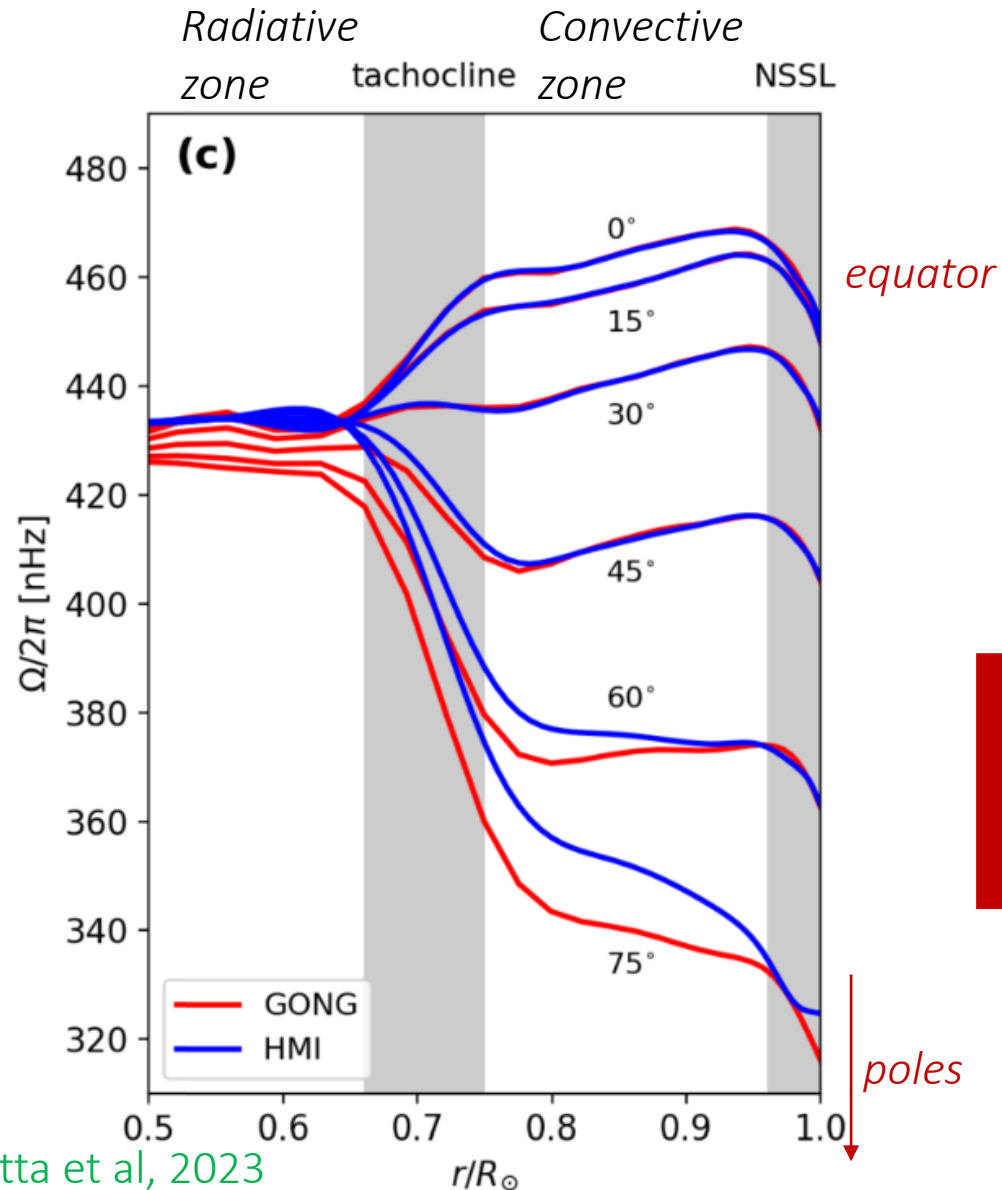
## Magnetic activity

- Intensity observations
- Chromospheric emission
- Dynamo and magnetic fields : spots, faculae, flares

## Flows

- Differential rotation
- Oscillations/pulsations
- Granulation
- Supergranulation, meridional circulation, convective blueshift inhibition

# Differential rotation



Reinhold & Gizon 2015

Kepler data

absolute shear  $\Delta\Omega$

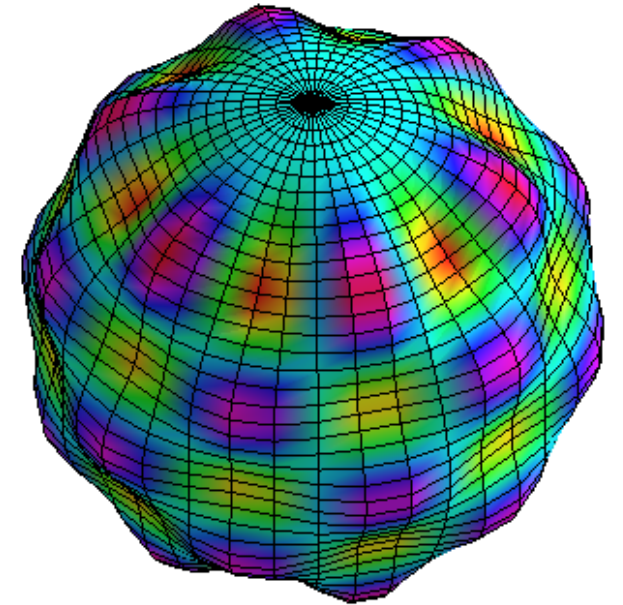
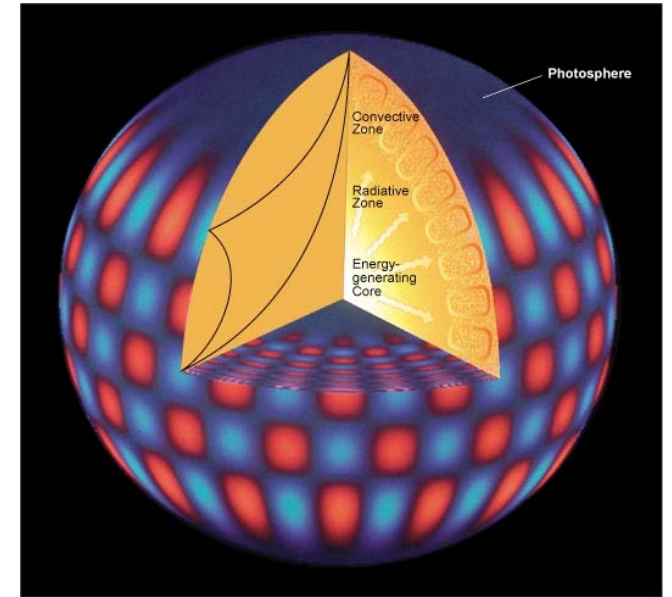
Leads to multiple peaks in periodograms

**Warning:** Usually from activity proxies related to spots  $\Delta\Omega = \Omega_{\text{max}} - \Omega_{\text{min}}$   
 → unknown latitude range!!!



# Oscillations and pulsations

- **Solar-type p-modes** (acoustic waves)
  - For the Sun: forest of peaks, ~5 minutes
  - Weak brightness variations (solar VIRGO/SOHO ~15 ppm [Fröhlich+97](#))
  - Scaling laws e.g. [Kjeldsen&Bedding11](#)
- Young massive stars exhibit strong pulsations ( **$\delta$ Scuti**: Kappa mechanism related to He,  **$\gamma$ Dor**: gravity wave)



# Granulation

## Convection pattern

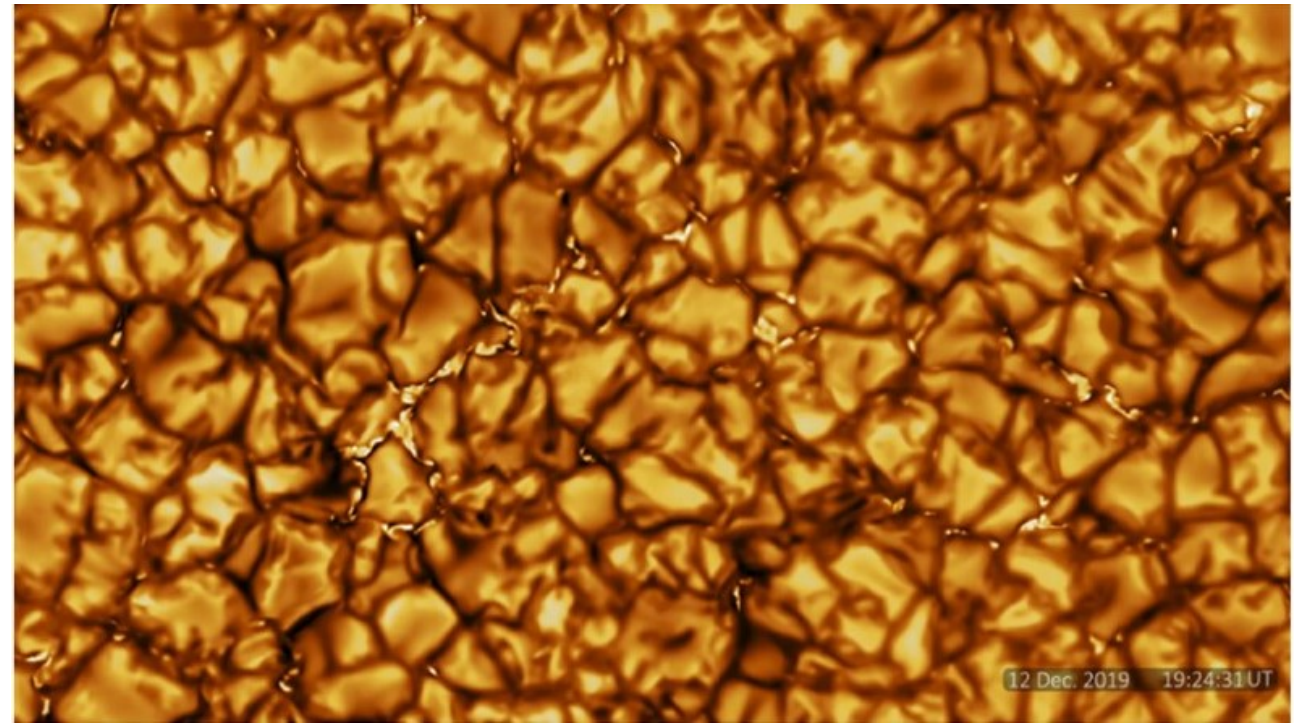
## Typical scales for the Sun

- Lifetime **~10 minutes** (large distribution)
- Size **~1000 km**
- Flows **~km/s**

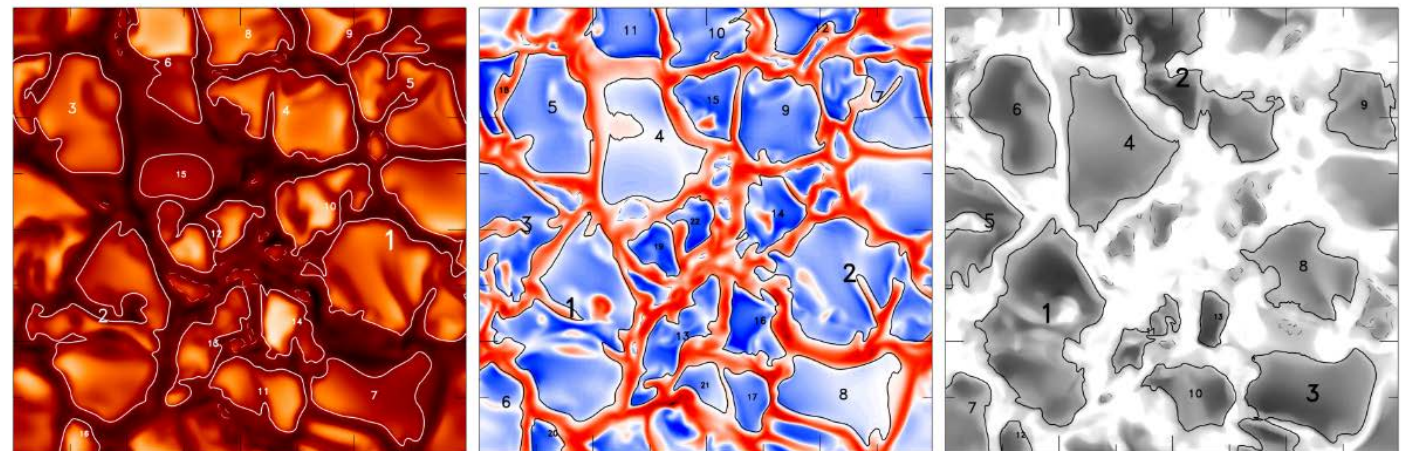
## Contrasts

- Contrast increasing from blue to IR
- Up to **~26%** in the blue
- Warning: estimation depends on spatial resolution

Lead to **convective blueshift**



D.K.Inouye telescope, Maui



Magic & Asplund 14

# Convection level in other stars

## Velocities and contrasts increase with Teff

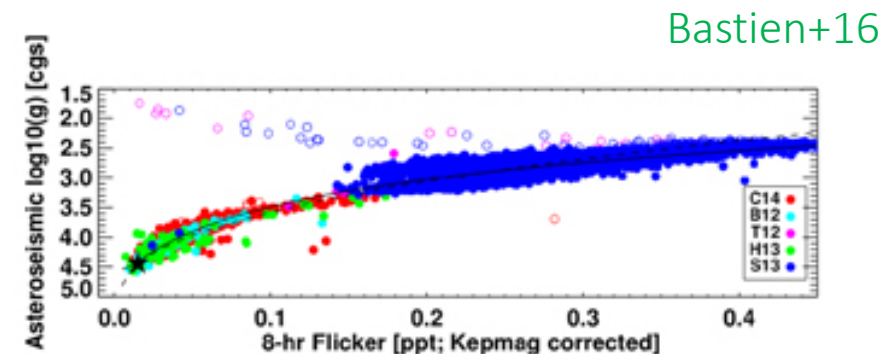
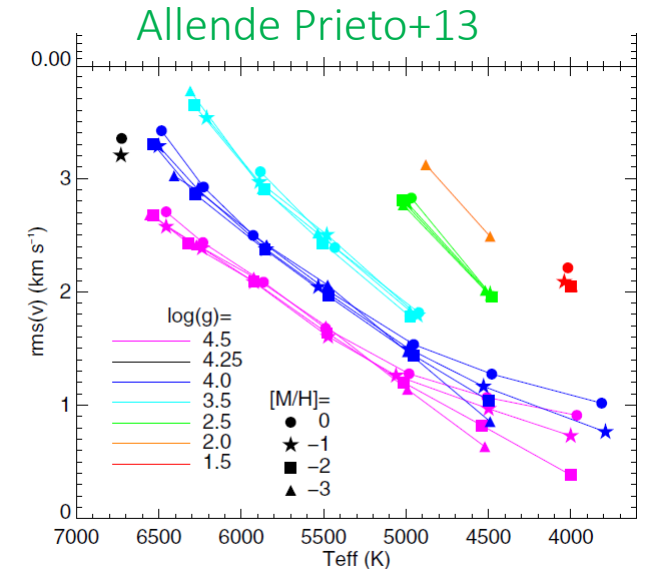
- Numerical simulations: CO5BOLD (Freytag+12, Allende Prieto+13, Tremblay+13), STAGGER (Magic+13,14, Chiavassa+18, Rodriguez Diaz+22,24), MURaM (Beeck+13,15), Trampedach+13 [not exhaustive]
- Observations : Gray 09, Meunier+17,18, Liebing+21 (through convective blueshift) Dumusque+11

## Contrast increases with decreasing metallicity

- E.g. Magic+13, Tremblay+13, Witzke+23

## Contrast increases with decreasing log g

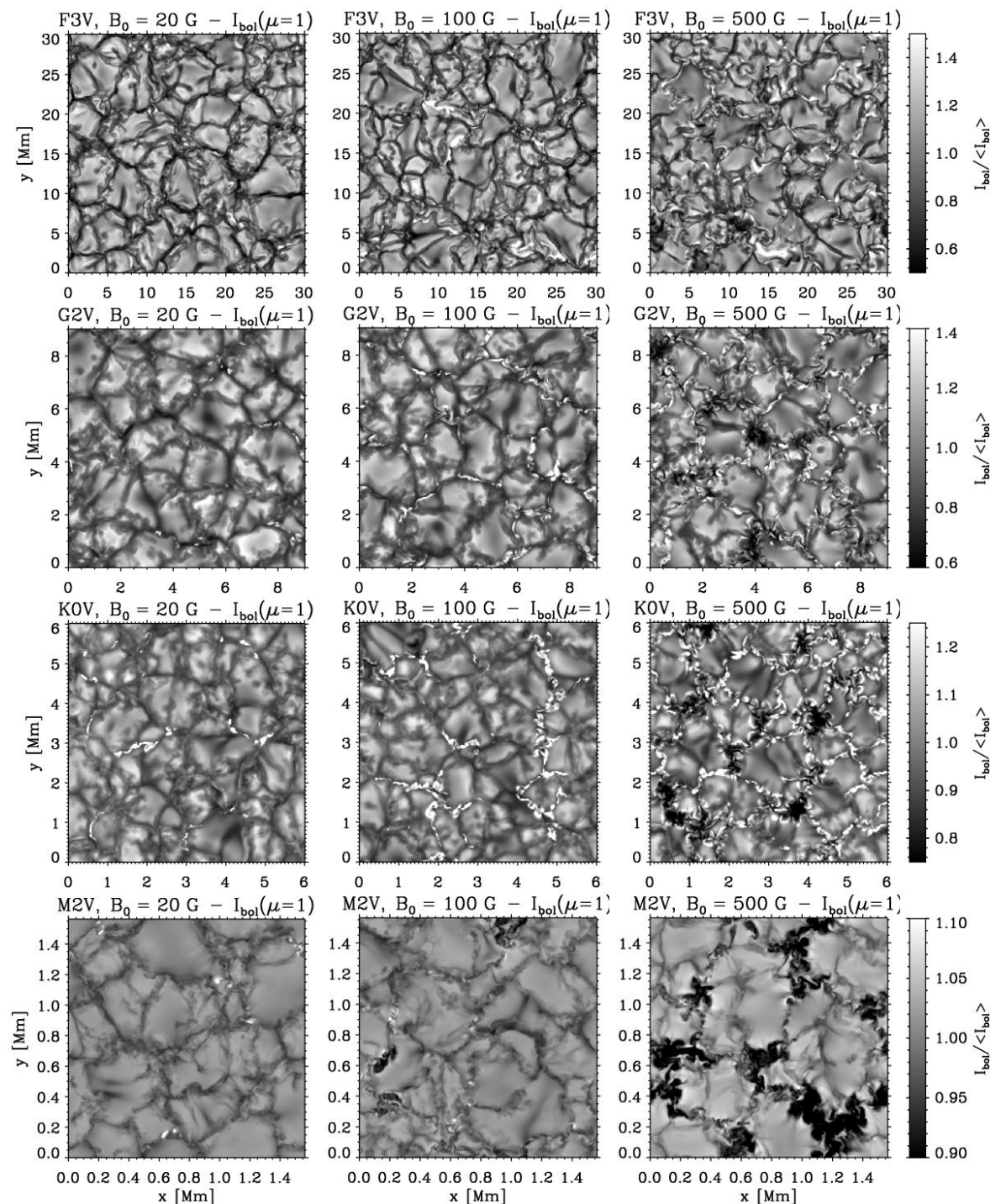
- E.g. Bastien+16



## Some include magnetic fields

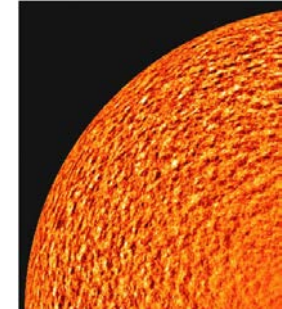
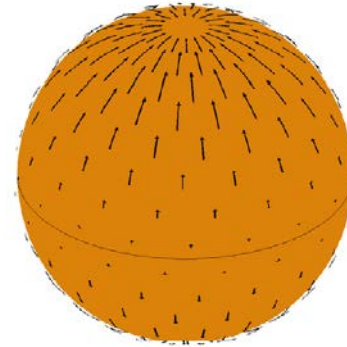
- Plage simulation
- $B$  = almost no dependence on  $T_{\text{eff}}$  or initial injected  $B$
- Expected impact of metallicity (Witzke+18,20)
- Change in behavior for  $M$  ?

Beeck+15

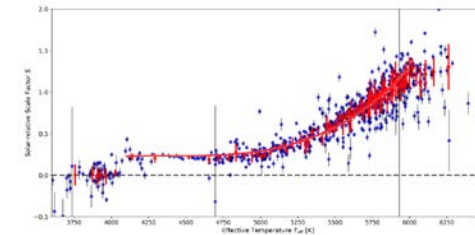


# Only for RVs

- Meridional circulation
- Supergranulation
- Granulation+magnetism => convective blueshift inhibition



➔ Details later in **RV section**



# Summary

Process	RV	Photometric transit	Transit spectroscopy	Astrometry
Spots & faculae	X (contrast, Zeeman)	X (contrast)	X (contrast, spectral features)	X (contrast)
Oscillations/pulsations	X	X	X	
Granulation	X	X	X	
Supergranulation	X			
Meridional circulation	X			
Convective blueshift inhibition	X			
Flares	X	X	X	

# Part 2: Methods to evaluate the impact and tools

- Methods to evaluate the impact on observables
- Data and tools

# Methods to estimate the impact on observables

*Solar observations*

*Solar and stellar  
simulations  
(forward modeling)*

*Solar observations combined  
with models  
Test of models on stellar  
observations*

⇒ To estimate the amplitude of different processes

⇒ To test mitigation techniques (blind tests)

*Not exhaustive: some mitigation techniques may help to characterise certain processes*

*Stellar observations*



# Solar observations

- **Reconstruction** of the **solar** integrated RV from observed velocity maps (dopplergrams)
  - Meunier+10, Haywood+16, 21, Milbourne+19
- **Indirect observations** of the integrated **solar** light
  - Asteroids, Moon, Jupiter satellites Lanza+16
- **Direct observations** of the integrated **solar** light
  - SOHO/Virgo (photometry), SOHO/GOLF (RV) Sulis+20a,b
  - HARPS-N (RV)+ other on-going/future projects similar to HARPS-N (VIS and IR) Dumusque+15, 21, Collier-Cameron+19, Zhao+23, ...

*RV, active regions*

*RV, active regions*

*RV, photometry,  
spectroscopy  
Active regions,  
supergranulation*

*Allow comparison with actual known surface features*

*Take all/most processes into account (including unidentified ones!!!)*

*But also include instrumental effects (Meunier+24)*

# Direct solar observations using stellar spectrographs

Dumusque+15  
Phillips+16  
Collier Cameron+19  
Dumusque+21 => *last version*

## Adaptation needed to feed the solar light to stellar spectrograph

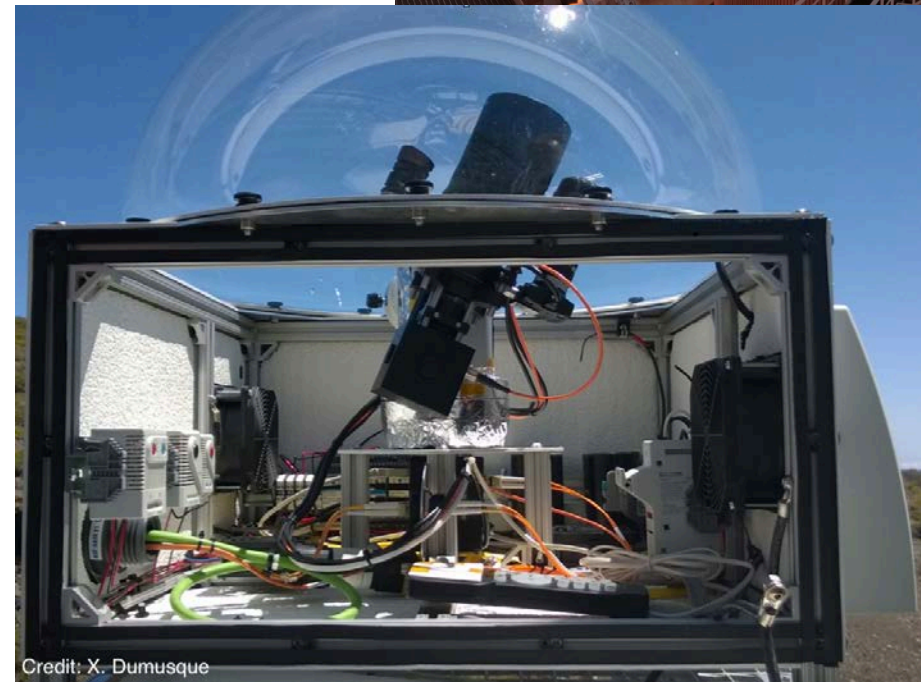
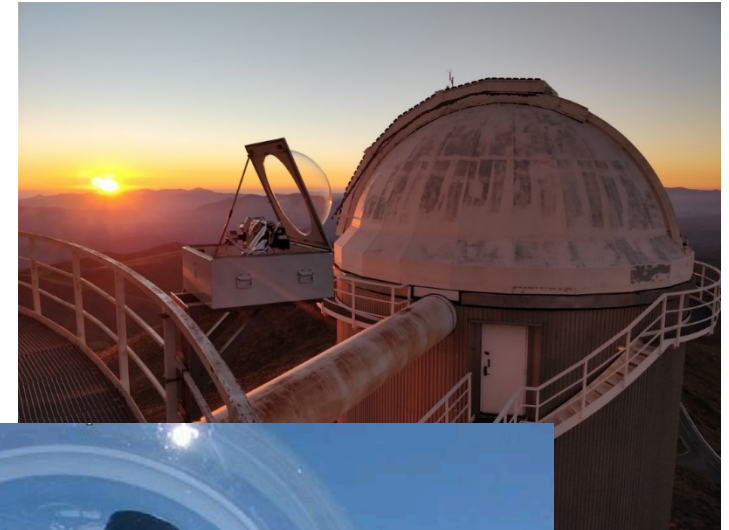
- Coelostat + sphere to integrate the light
- HARPS-N@La Palma → ~6h/d, 5 min cadence ≈ 8 years (3 years public data)

## Adaptation needed / data processing

- Finite solar size+rotation+atmosphere
- Precise removal of known planets

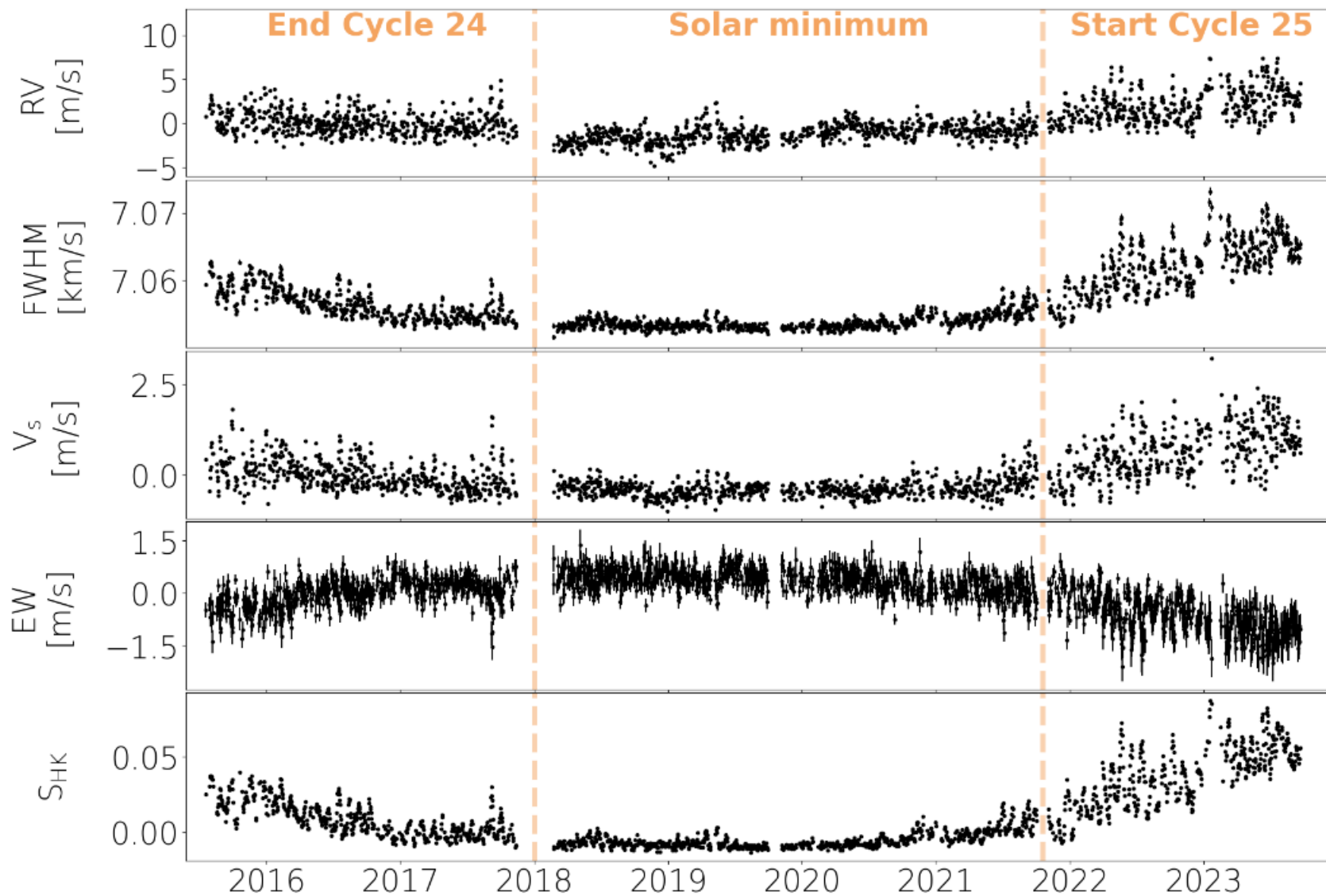
## Many on-going projects

- HARPS (south) @ La Silla + IR
- Expres @ Lowell obs.
- NEID @ WIYN
- Poet project @ Espresso/VLT (N. Santos)
- ...



Credit: X. Dumusque

Klein+24



# Solar and stellar observations combined with models

- Reconstruction based on **observed solar** structures + **models** = forward modelling *RV, active regions*
  - Makarov+10, Meunier+10,24
- **Adjustment** of models on well-sampled **stellar** observations *RV, active regions*
  - Dumusque+14

*Robustness of the results*

*Make the link between observations and simulations*

*Adjustment not often done in RVs because of the temporal sampling*

# Solar & stellar simulations (forward modeling)

- **Simulations** of integrated RV from **synthetic spots and faculae**, representative of **solar & stellar** configurations
  - Simple activity configuration [Desort+07](#), [Boisse+12](#), [Dumusque+14...](#)
  - Complex activity patterns [Borgniet+15](#), [Herrero+16](#), [Dumusque+16](#), [Meunier+19](#)
  - ...
- **Flow simulations** based on **empirical laws** [Meunier+19,20](#)
- **MHD simulations** of the **solar** and **stellar** surface [Meunier+15](#), [Cegla+18,19](#), [Sulis+20,22](#) (+ many others for different purposes)

*RV, photometry,  
active regions,  
granulation/SG*

*RV,  
granulation/SG*

*RV, photometry,  
granulation*

*Extend the models to other stars*

*Study processes separately to understand their behavior*

*Allow blind tests*

# Activity simulations

(spots, faculae, inhibition convective blueshift)

One/few spots

Complex & realistic activity  
pattern of spots and plages

## Objectives

- To derive typical RV amplitudes and shapes for simple activity configuration
- To study fine effects
- To model observations

## A few results

- Dependence on spectral resolution,  $v \sin i$ , latitude, center-to-limb variation
- [Desort+07](#) [Boisse+12](#) [Dumusque 14](#)

## Objectives

- To derive (predict) detection limits
- To test temporal samplings / observing strategies
- To test correction methods / blind tests
- To identify properties that could be used in new methods
- May include granulation, supergranulation...

## A few approaches

- List of structures => analytical time series
- List of structures => integrated spectra => analysis similar to stellar observations
- [Borgniet+15](#), [Herrero+16](#), [Dumusque+16](#), [Meunier+19](#) ...

*See more details in appendix*

# + Many stellar observations performed in stellar physics context

- Photometry: spot modeling, rotation period determination, attempt to search for cycles, ...
- Chromospheric emission: rotation period, search for cycles, ...
- Spectropolarimetry: large scale and small scale magnetic fields
- Spectroscopy: fundamental parameters,  $v \sin i$ , ...
- Interferometry: stellar radius, ...
- ...

# Open source codes

(see list in [Rackham+22](#))

- SOAP ([Boisse+12](#), [Dumusque+14](#)) => RV (and line shape), photometry, spot and faculae + SOAP-T ([Oshagh+13](#)) => transit, spot-occultation (2D map)
- STarsim2 ([Rosich+20](#)) => RV (and line shape, CCF), photometry, spot and faculae
- ECLIPSE ([Silva+13](#))=> transit, spot-occultation (2D map)
- PRISM ([Tregloan-Reed+13](#)) => transit (2D map)
- SPOTROD ([Béky+14](#)) => transit, spot occultation (semi-analytic)
- STSP ([Davenport15](#),[Morris+17](#),[Schutte+22](#)) => transit, spot-occultation
- ellc ([Maxted16](#)) => transit, spot-occultation (semi analytical, semi numerical)
- Probably others...



# Part 3: Impact on observables and tools to mitigate stellar variability

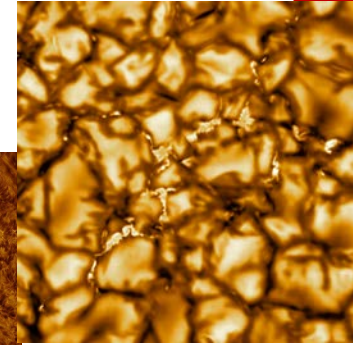
- RV
- Photometric transits
- Atmosphere characterisation (transit spectroscopy)
- High precision astrometry

# Summary

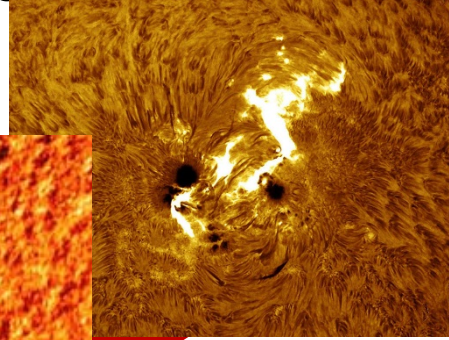
Process	RV	Photometric transit	Transit spectroscopy	Astrometry
Spots & faculae	X (contrast, Zeeman)	X (contrast)	X (contrast, spectral features)	X (contrast)
Oscillations/pulsations	X	X	X	
Granulation	X	X	X	
Supergranulation	X			
Meridional circulation	X			
Convective blueshift inhibition	X			
Flares	X	X	X	

# Processes affecting RVs and time scales

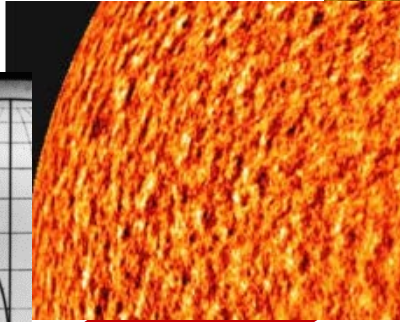
Minutes



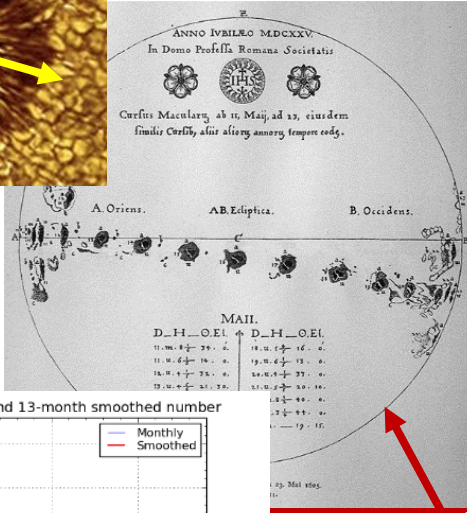
Hours



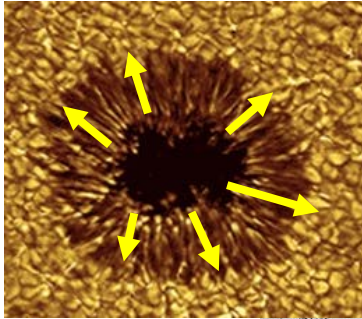
Days



Month

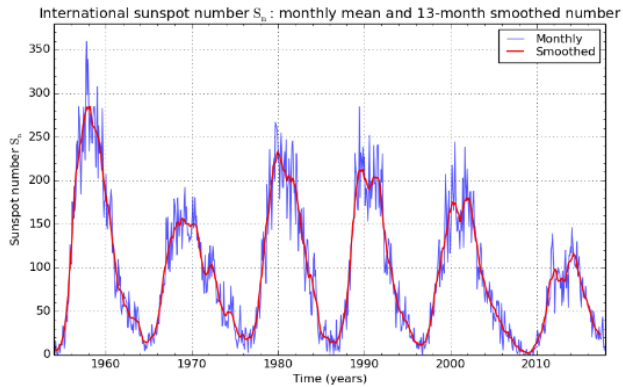


Evershed flows



Years

Decades+



SILSO graphics (<http://sidc.be/silso>) Royal Observatory of Belgium 2017 December 1

Flares

Supergranulation

Granulation Pulsations

Convection inhibition

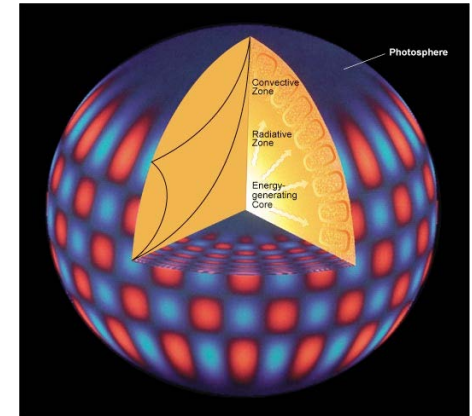
Spots, plages

Rotation period, cycle

Evolution of structures / lifetime

Large scale flows

Gravitational redshifts (Cegla+12)



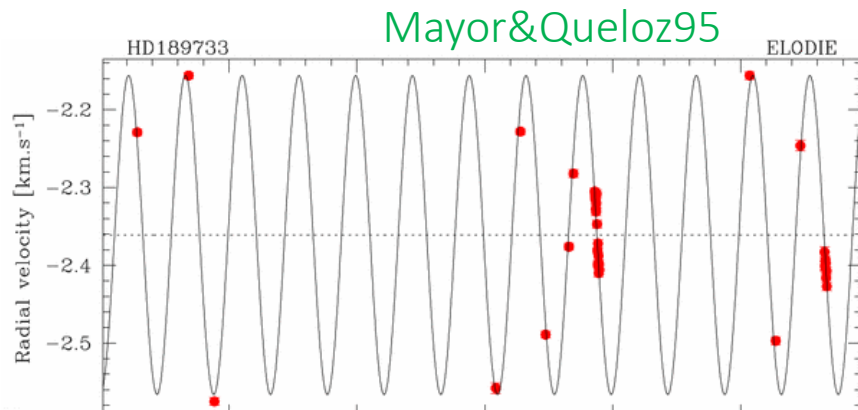
See reviews Meunier+21,24

# Temporal sampling issue

## Radial velocities

**Planet:** Research of long term signal (depending on orbital period), *all points affected by planet*  
**Star:** Signal at all time scales

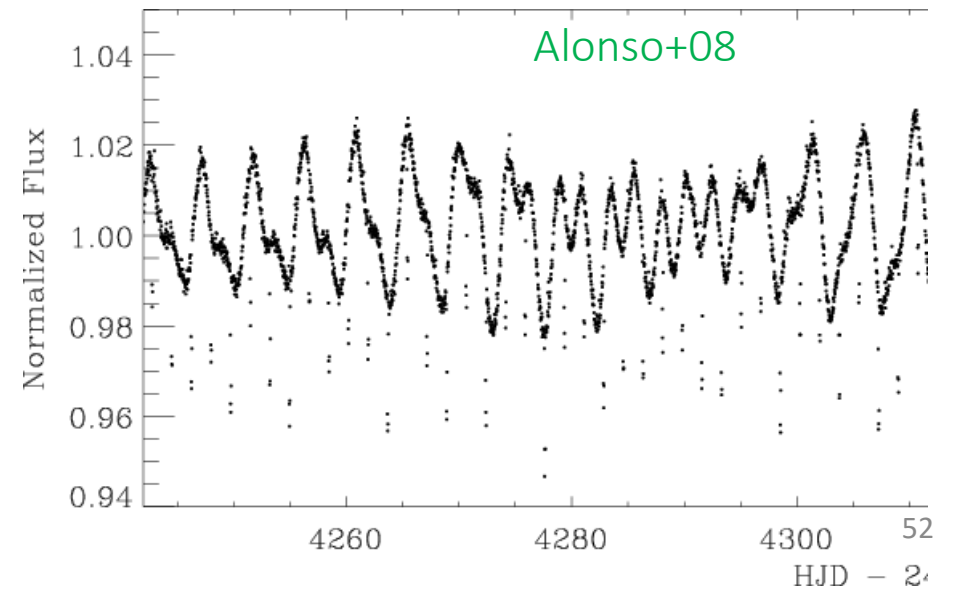
*Very irregular and sparse sampling, bad phase covering (planet & star)*



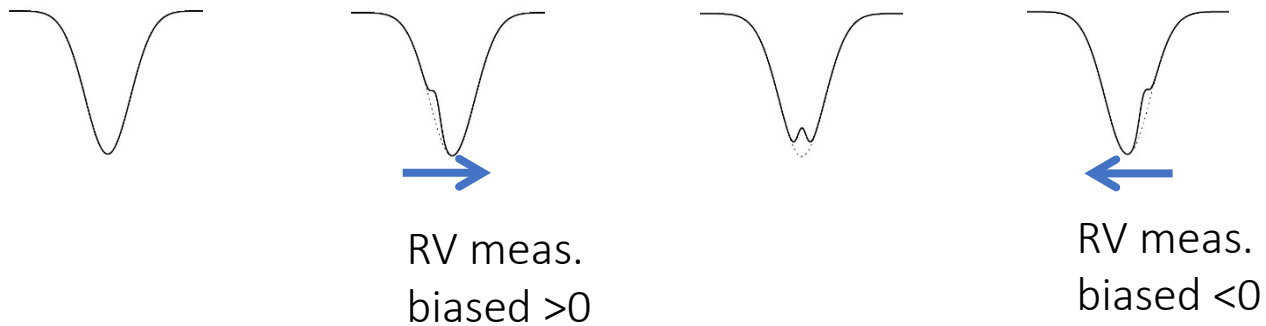
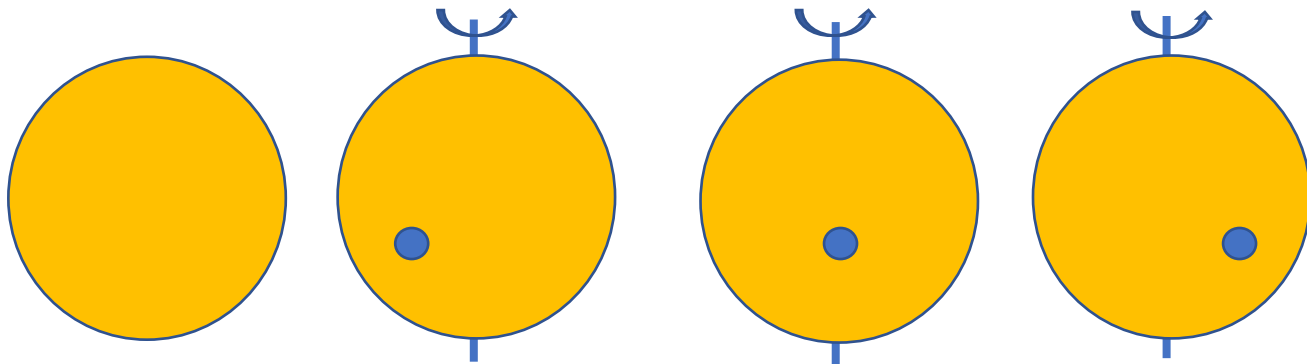
## Photometric transit

**Planet:** Search for short-term signal, *small fraction of the time series impacted by the planetary signal*  
**Star:** signal at all time scales

*Regular and dense sampling, limited time span*

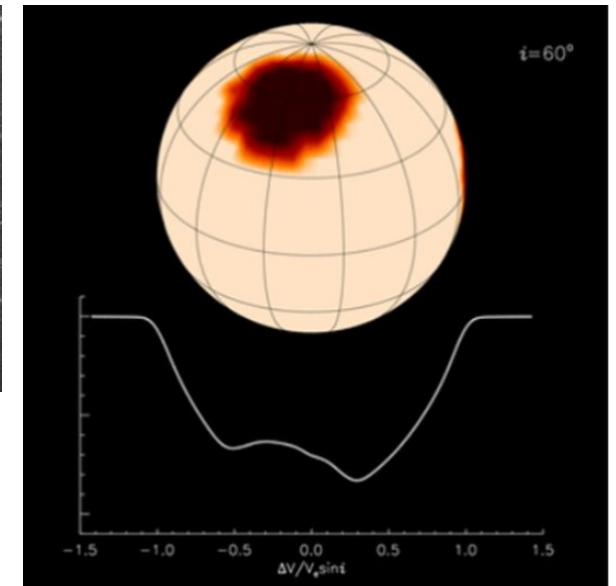
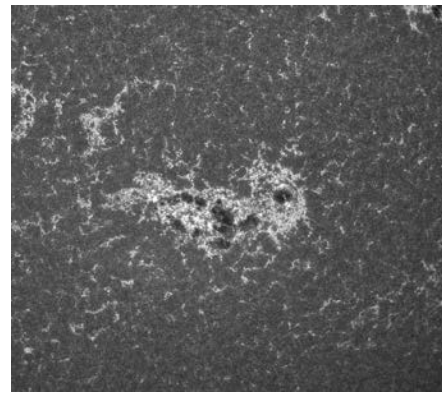


# Spots and faculae/plages

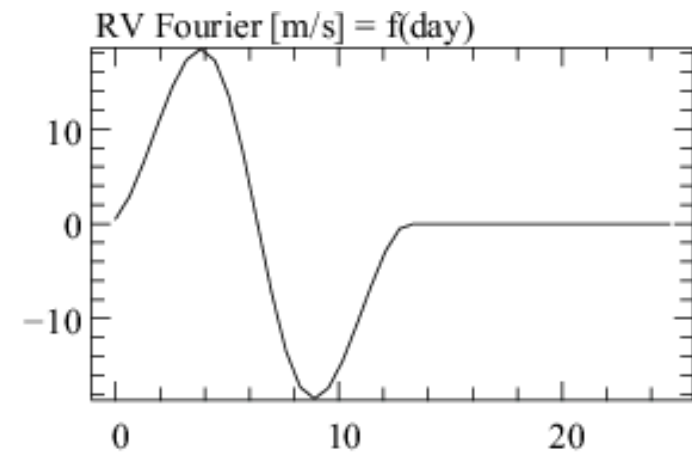


*RV signal due to line distortion*

Saar&Donahue97,  
Hatzes02, Saar+03,  
Wright05



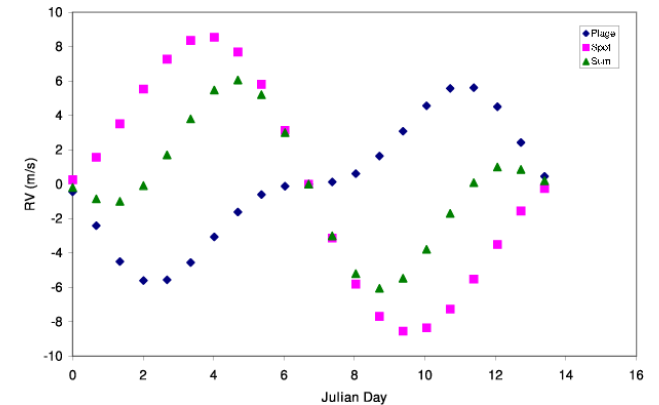
O. Kochukhov (movie)  
<http://www.astro.uu.se/~oleg/>



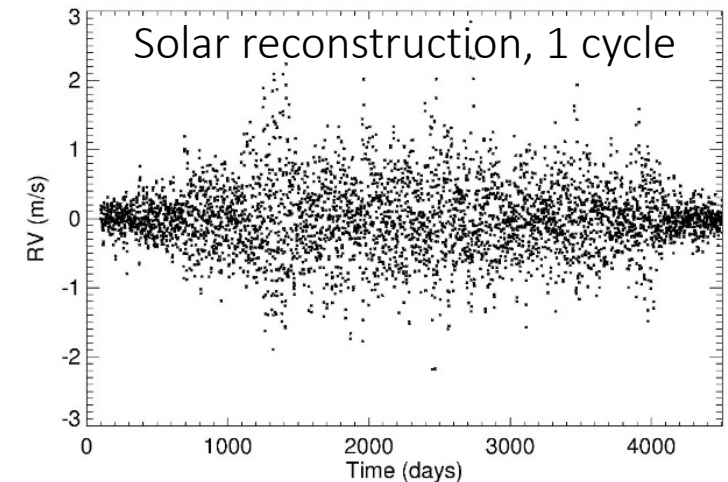
+ déformation des raies  
Desort+07

# Typical RV properties due to spots and plages

- Typical time scales: week-months (-years)
  - *Rotational modulation* + harmonics (incl. active longitudes) + differential rotation
  - *Finite lifetime* + structure evolution
- Amplitude in RV
  - RV dispersion 0.1 up to >1 m/s for solar-type stars
- Effect of
  - Stellar inclination
  - Wavelength
  - Degeneracy spots/plages
  - Magnetic fields → Zeeman effect Reiners 13, more important in IR



Lagrange+10



Meunier+10

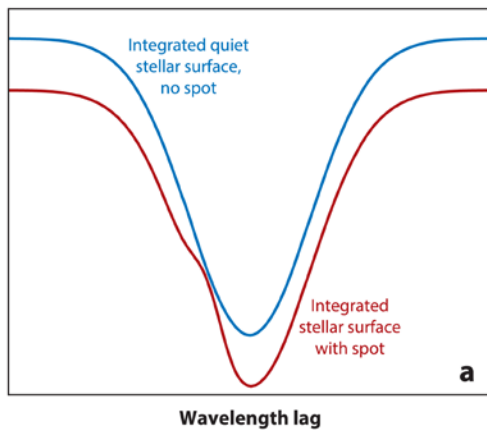
# Important properties for correction purposes

## Line distortion

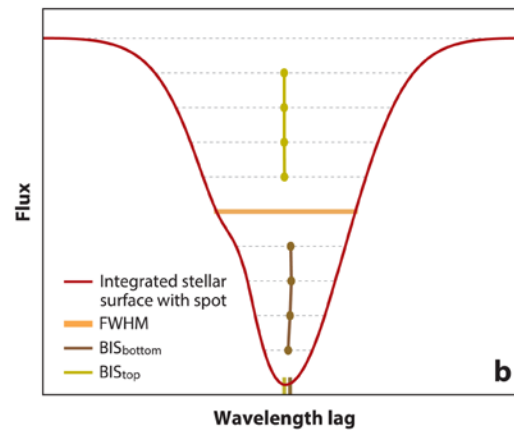
identified for a long time  
 ⇒ bisector shape (BIS) often used as activity indicator

⇒ FWHM

Indicators derived from the CCF

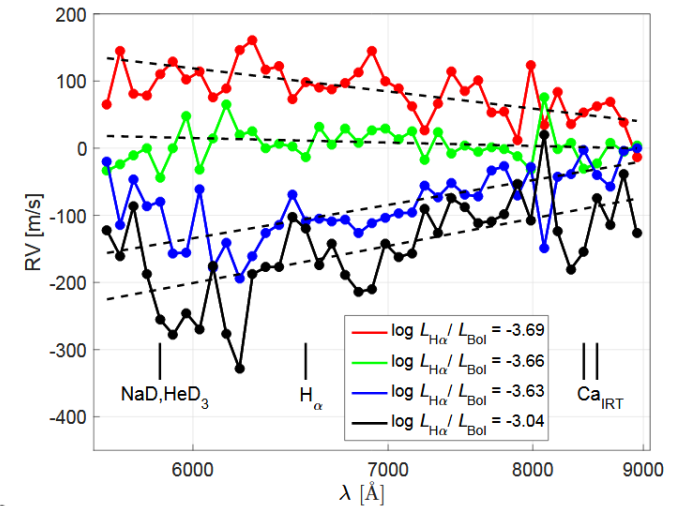
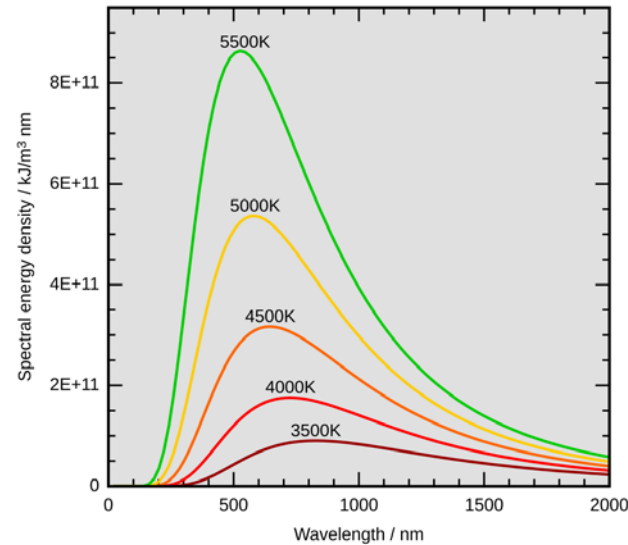


Sum of CCF and bisector



## Chromatic dependence

of the contrast due to black body  
 Much remains to be understood to understand the observed differences between VIS and IR



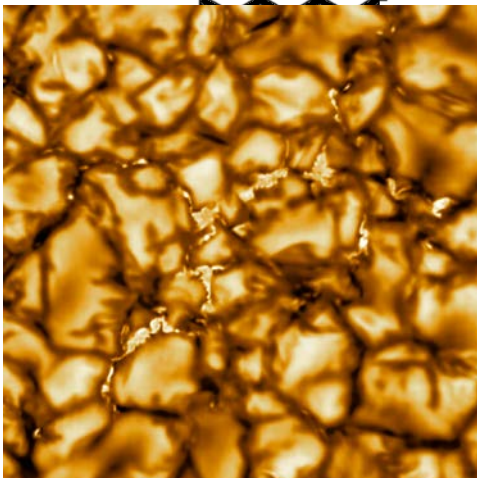
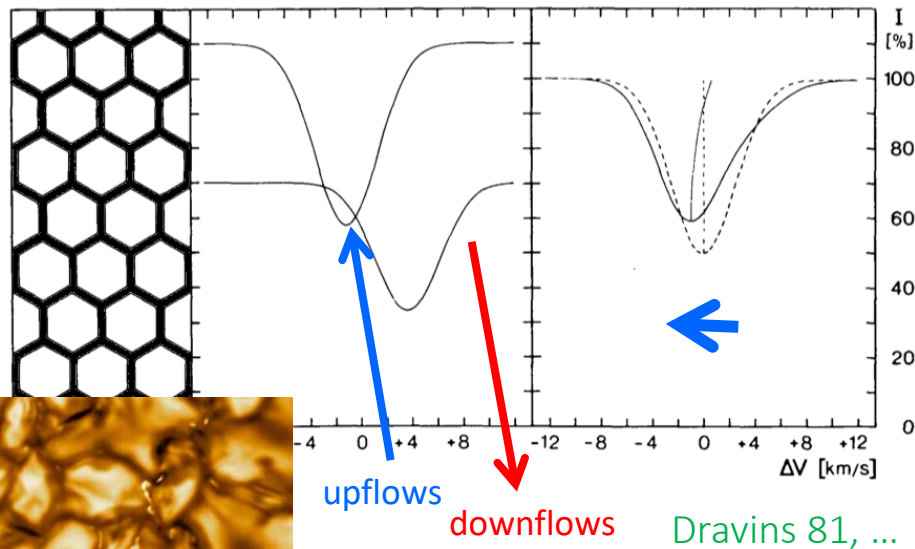
Tal-Or+18 CARMENES/VIS

Hara&Ford23

# Inhibition of the convective blueshift in plages

## Stellar convective blueshift

Sun  $\approx$  300-400 m/s



## Attenuation in plages

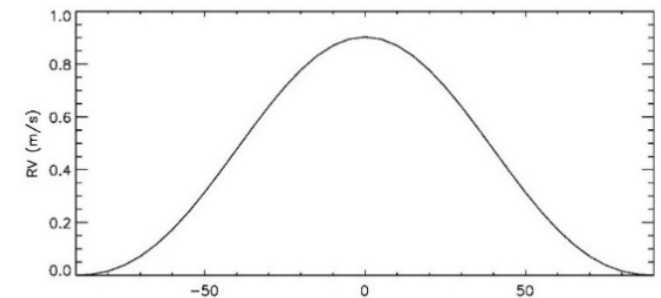
Magnetic field  $\rightarrow$  Inhibition of the flows  
(anomalous granulation)

Weaker in network structures

RV = Net redshift  
Maximal RV when plage on central meridian  
 $\sim$  correlation with  $\log R'_{\text{HK}}$  (filling factor)

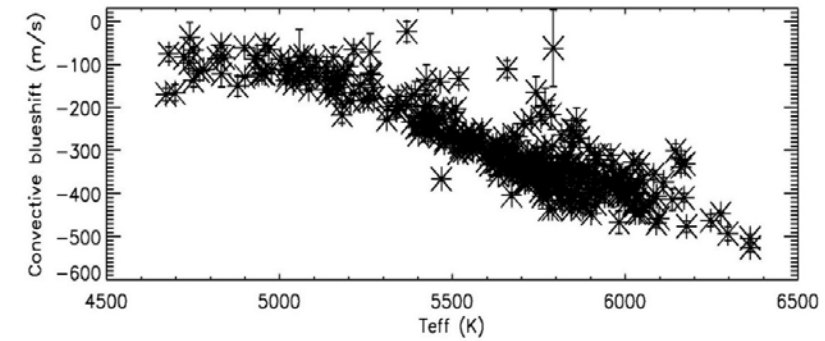


Flows + Magnetic activity

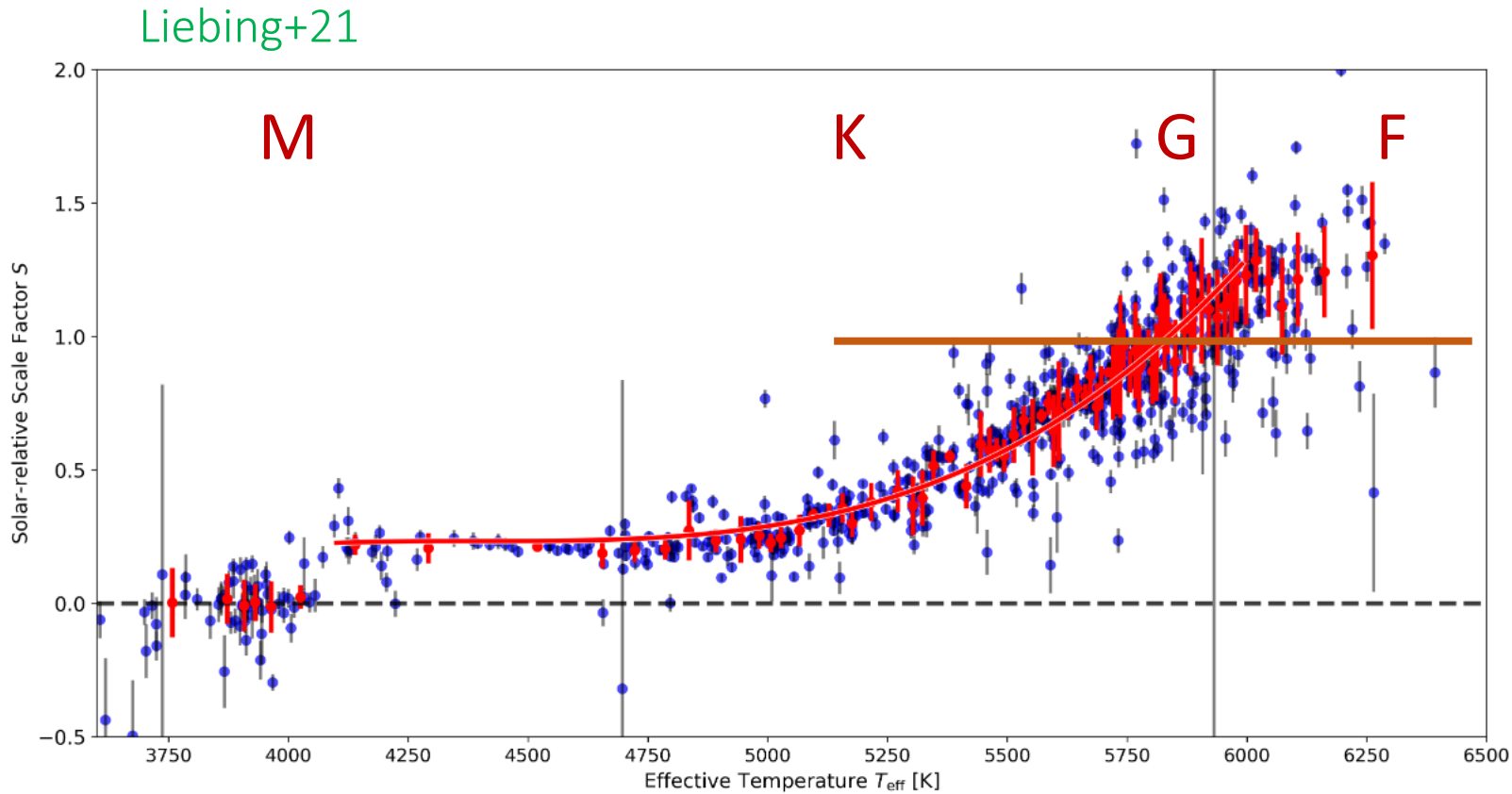




# Convective blueshift versus $T_{\text{eff}}$



Meunier+17



Several applications to other stars: eg. Dravins 1987, 1989, Allende Prieto et al 1999, Landstreet 2007 ...

Variability of the inhibition factor versus spectral type Meunier+17a,b

Temporal variability for the Sun Meunier+24

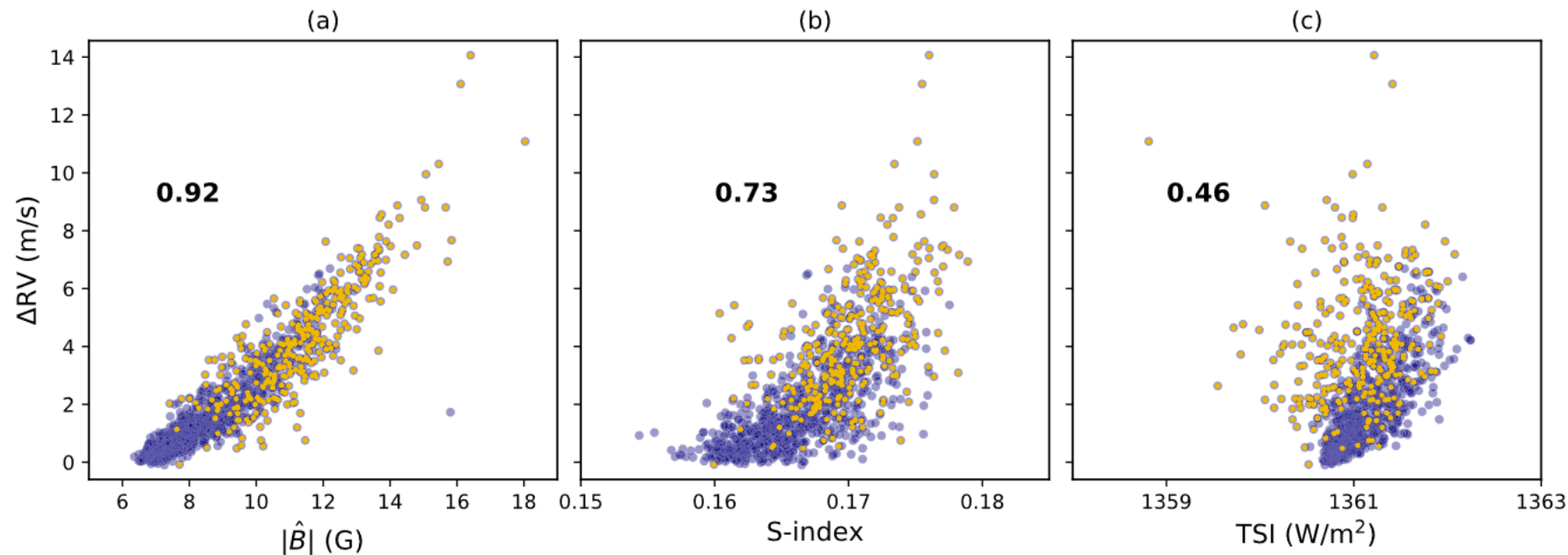
# Important properties for correction purposes

Correlation with ff faculae =>  $\log R'_{\text{HK}}$  often used

- but see departure due to projection effects+butterfly diagram [Meunier+19](#)

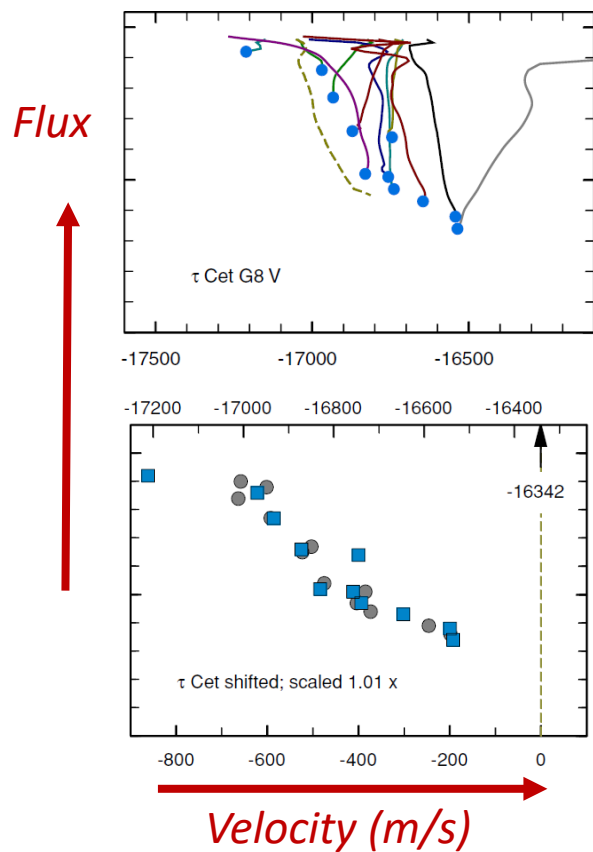
Average  $|B|$  ([Haywood+22](#)) correlates better with RV

- see [Lienhard+23](#) for tests on the Sun



# Important properties for correction purposes

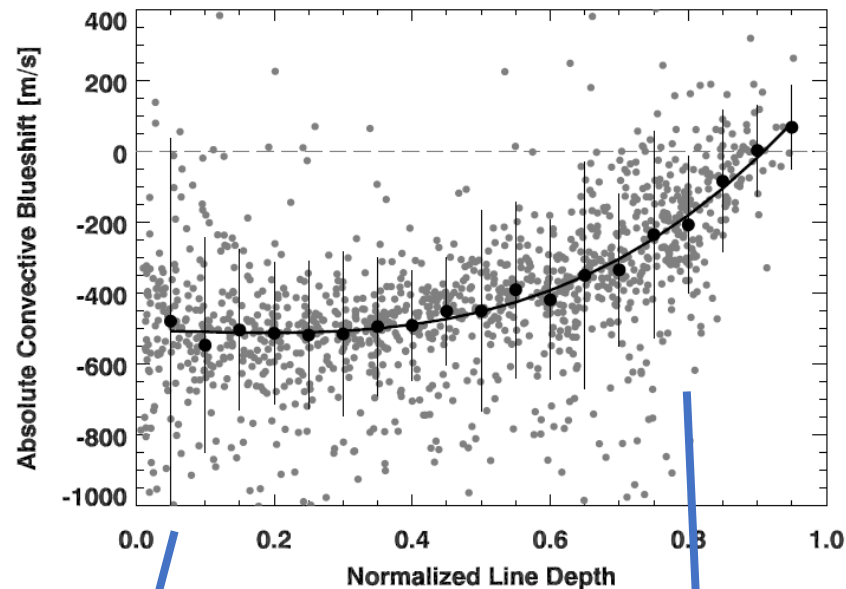
## Depth dependence



Gray 09

→ Universal signature

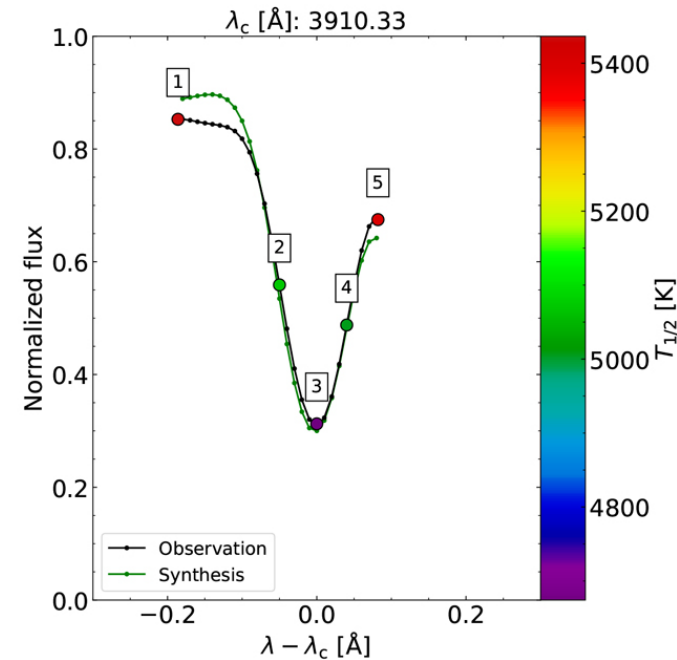
Reiners+16



Weak lines  
Formed  
lower

Deep lines  
Formed  
higher

Al Moulla+22,23



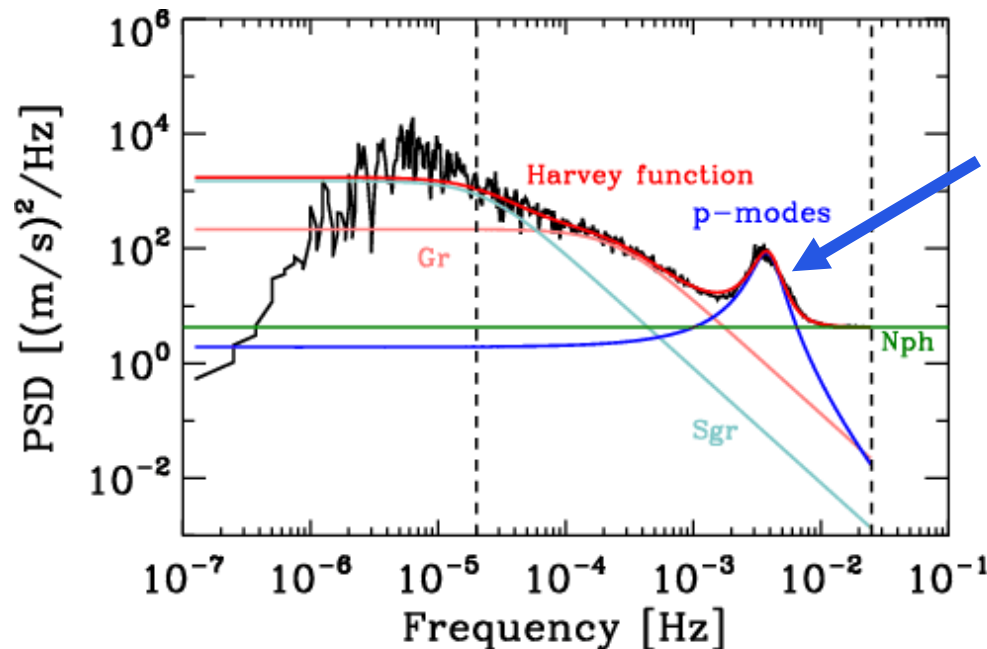
**Warning:** signal visible mostly with line core (Gray09) ; selection of lines of different depths=> no strong variability of the RV amplitude (Meunier+24)

# Oscillations and pulsations

Typically  $\sim$  a few min for solar type stars (p-modes),  
 $\sim 1$  m/s

- Many peaks in the power spectrum with well-defined envelope (Kjeldsen95, ...)
- $\rightarrow$  Helioseismology / asteroseismology
- Easily averaged Dumusque+11, Chaplin+19

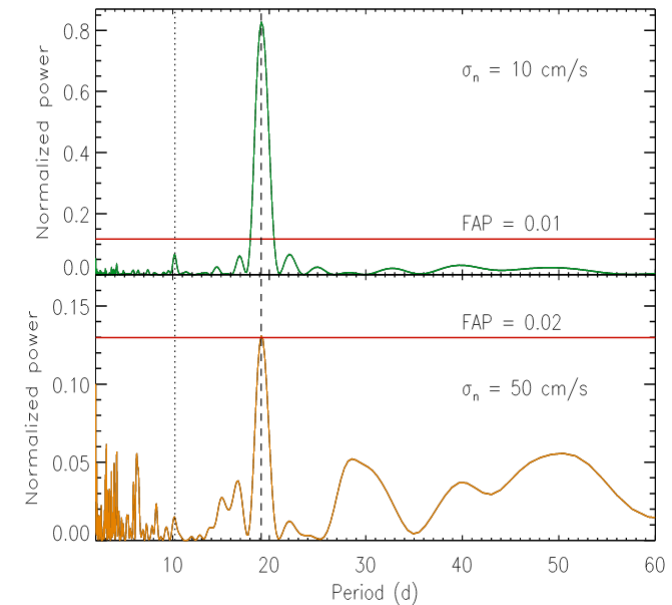
Lefebvre+08  
 + many other papers  
 Based on laws from  
 Harvey85



## • Impact of sectoral r-modes

- Global scale equatorial Rossby wave
- Main mode for the Sun = 0.44 m/s @ 19.16d

Lanza+19

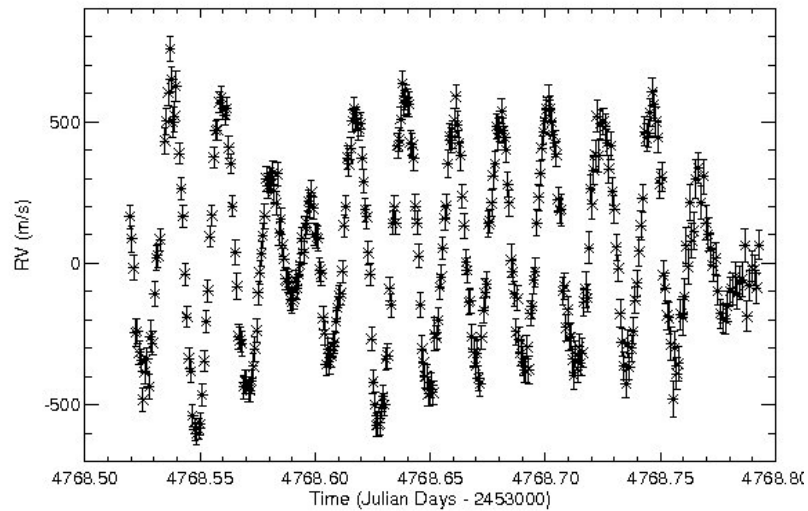


# Pulsations $\delta$ Scuti, $\gamma$ Dor

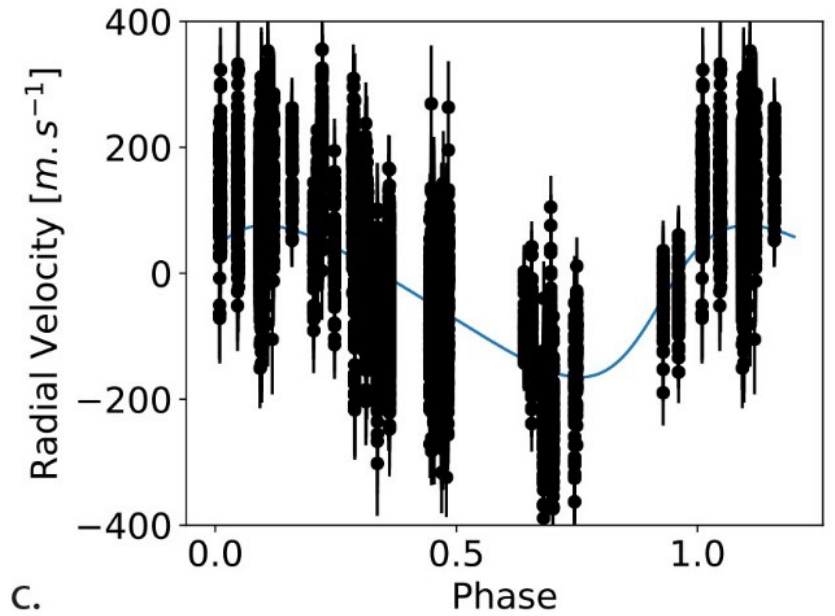
Different time scales depending on the star (minutes - hours)

Can be of very high amplitude, for ex.  $\delta$  Scuti  $\rightarrow$  critical to detect planets

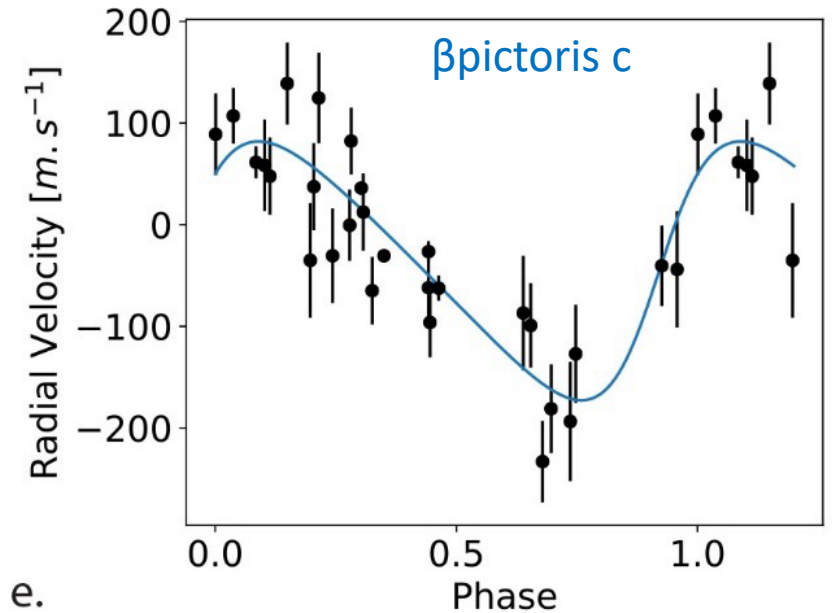
Example:  $\beta$ Pictoris (A star,  $\delta$ Scuti), Lagrange+19, 20



7 hours

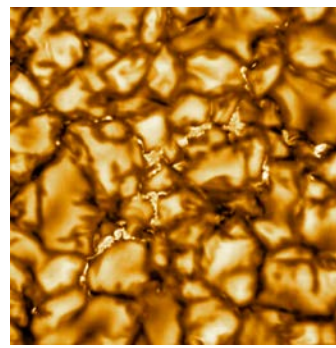


c.



e.

# Granulation



DKIST

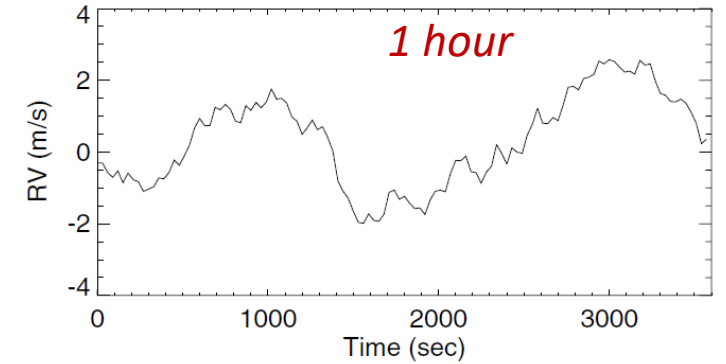
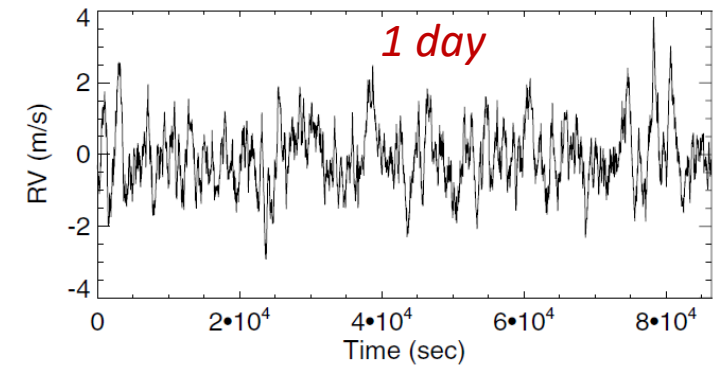
Different realisations of the  $10^6$  granules over time  
→RV(t)

## Solar observations

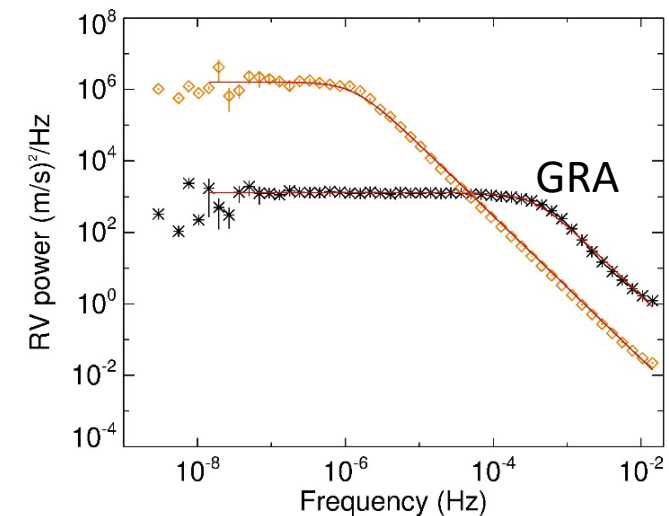
- Elsworth+94, Pallé+99  $\sim 0.4$  m/s from specific lines

Solar simulation of  $\sim 10^6$  granules based on properties from HD simulations

- Meunier+15  $\sim 0.8$  m/s
- Power spectrum compatible with proposition from Harvey 84,85
- For a large number of simulations : use of the Harvey power spectrum
- Makes it difficult to average (1h => / $\sim 2$ )



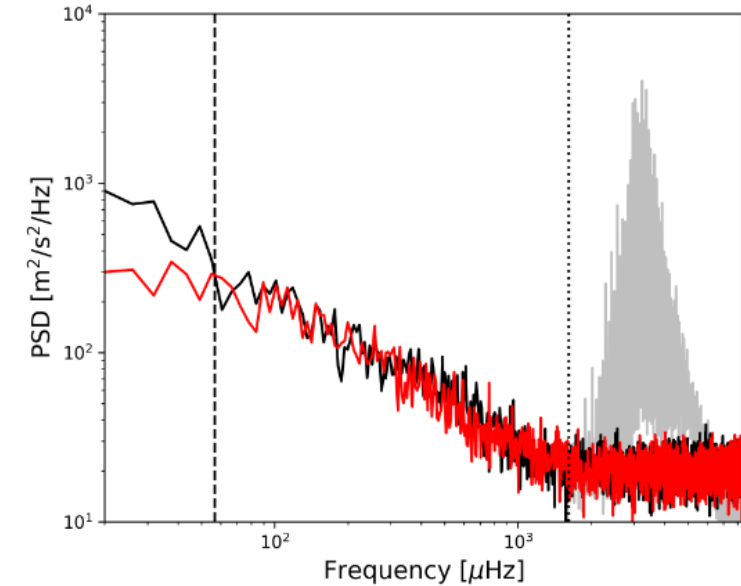
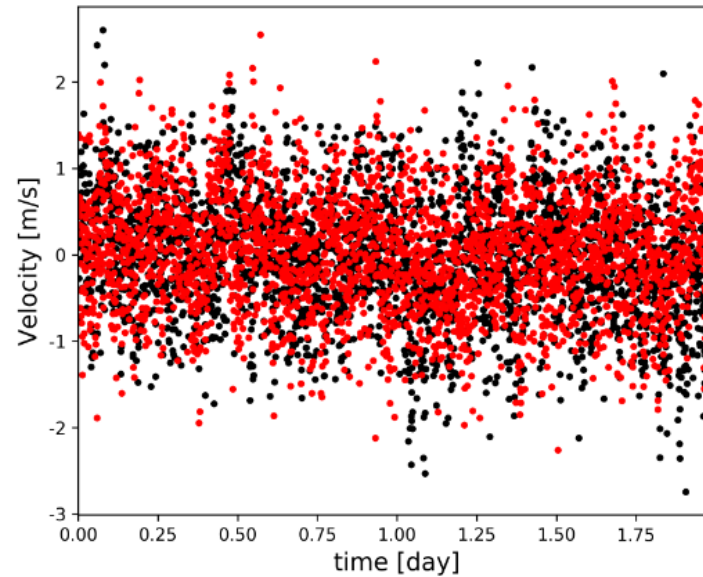
Meunier+ 15



# RV due to granulation in 3D HD simulations

## Direct MHD simulation in small boxes

- Cegla+19 : low amplitude of the signal
- Sulis+20 comparison with observed solar RVs SOHO/GOLF in the Na doublet =>  $\sim 0.4$  m/s
- Importance of the shape of the power spectrum



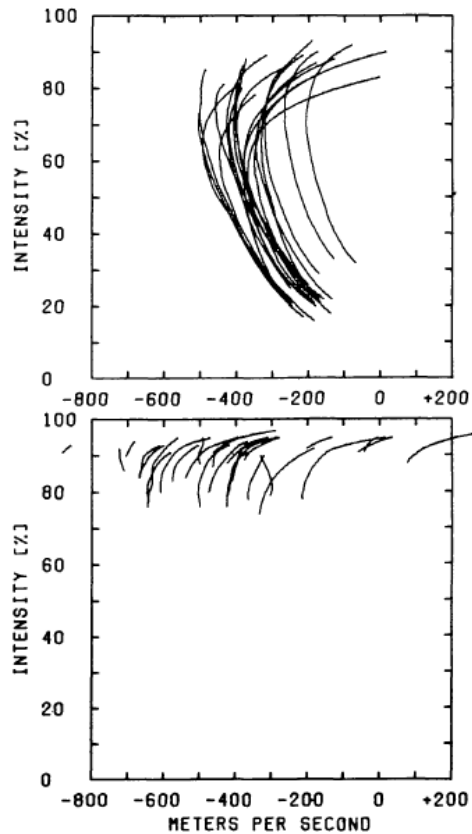
GOLF/SOHO observations

MHD simulations

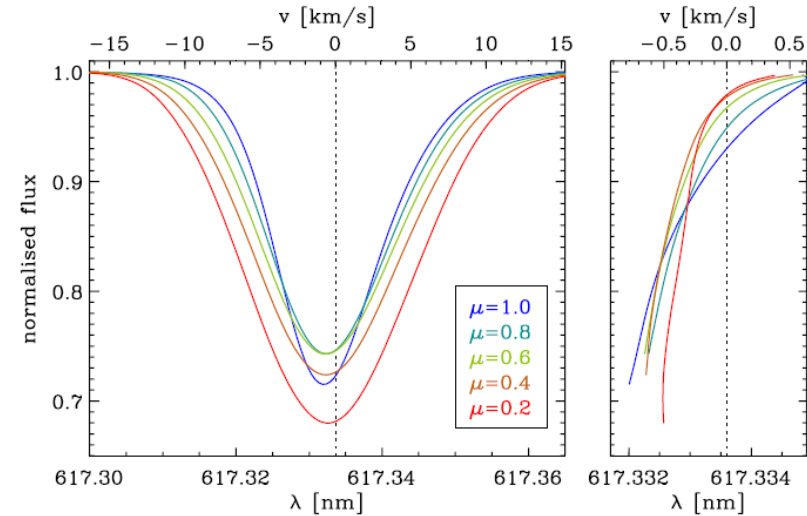
Sulis+ 20

# Important properties: line shape

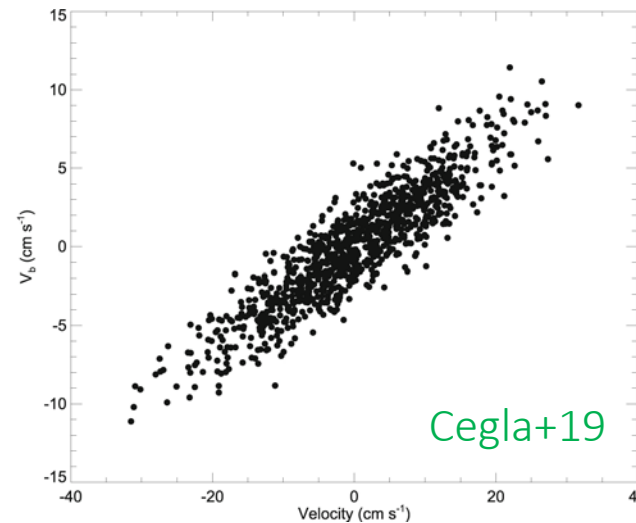
Strong distortions of the line shapes



Dravins+81  
Observed  
See also Dravins+21...



Beeck+13



Cegla+19

Line-shape effect superposed  
on those due to other  
processes  
Impact of spectral resolution



# Supergranulation

Large cells outlined by the magnetic network

- [Leighton+1962](#)
- Solar lifetimes  $\sim 24\text{-}48\text{h}$
- Size  $\sim 20000\text{ km}$
- Horizontal flows  $\sim 200\text{-}300\text{ m/s}$
- No intensity contrast
- Origin unknown, perhaps due to explosive granules
- Many work related to cycle variations (due to magnetic field inside the cells)

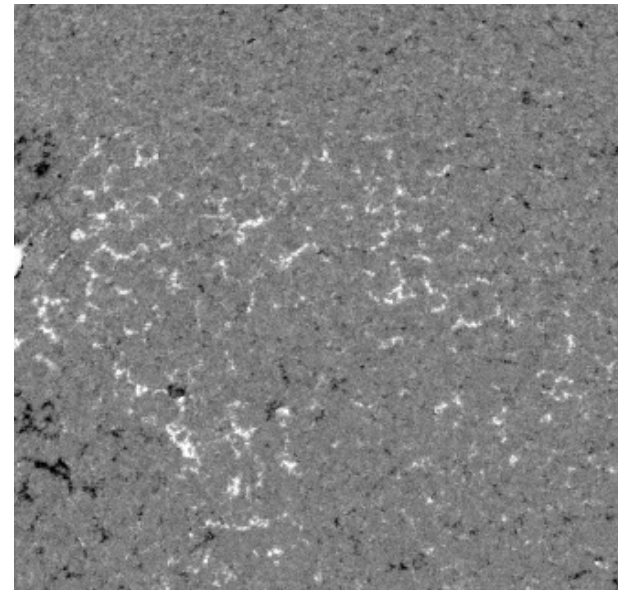
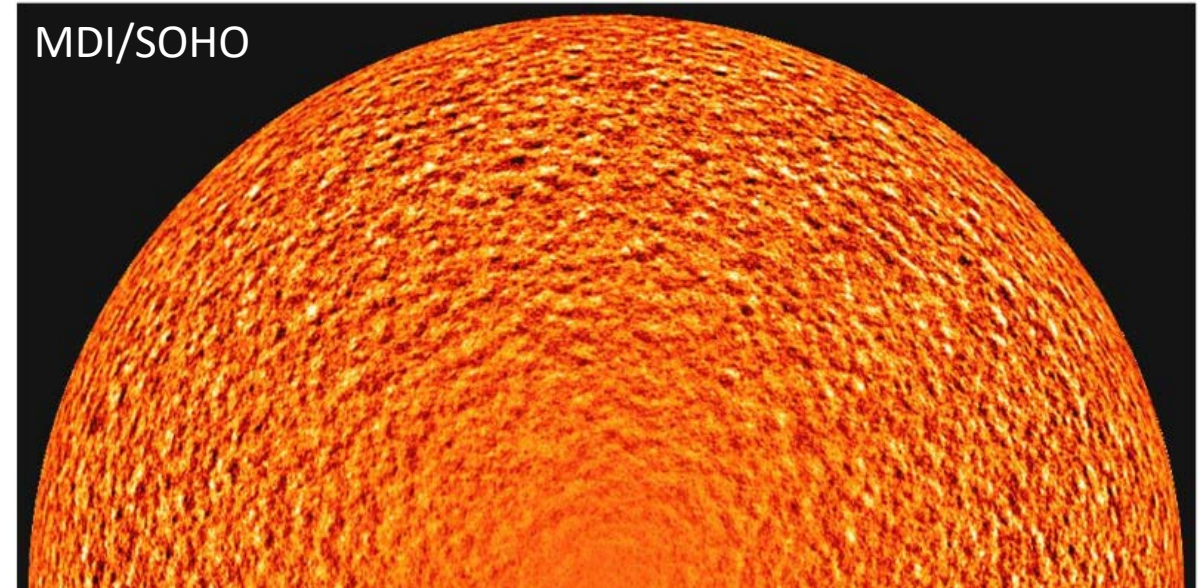
Not characterised for other stars

- Likely scaled to granules

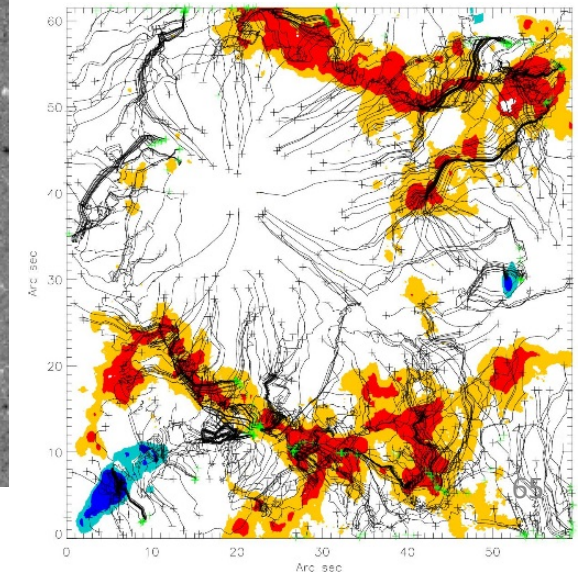
See reviews

[Rieutord+10](#)

[Rincon+18](#)



[Roudier+16](#)



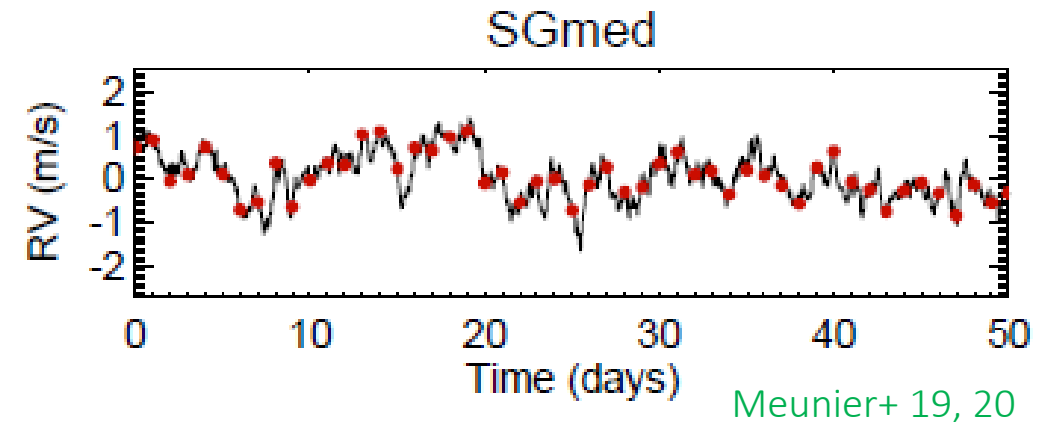
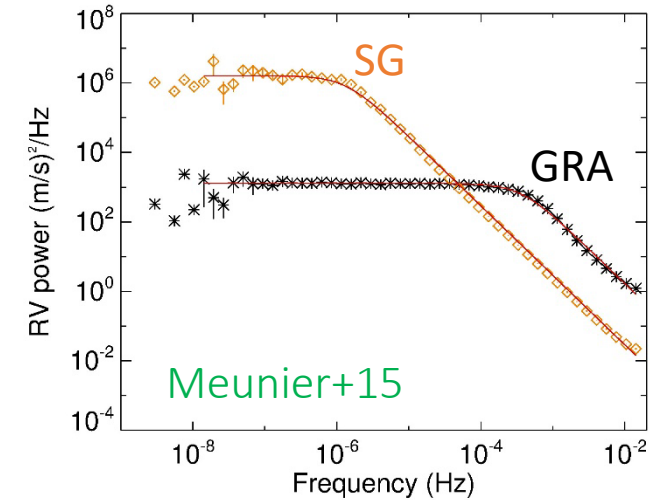
# Supergranulation

## RV jitter not well constrained

- Slower flows than granulation but less cells on the surface → Jitter remains strong !
- Solar observations [Palle+99](#) **0.78 m/s**
- Solar estimation from simulations: median value **0.7 m/s** (low estimate 0.3 m/s [Meunier+15](#))
- Medium value compatible with day-to-day from HARPS-N **1.02 m/s** [Dumusque+21](#)
- Recent results on HARPS-N solar data :
  - ~0.7 m/s [Al Moulla+22](#)
  - ~0.9m/s [Lakeland+24](#)

More difficult to average

No link with usual indicators



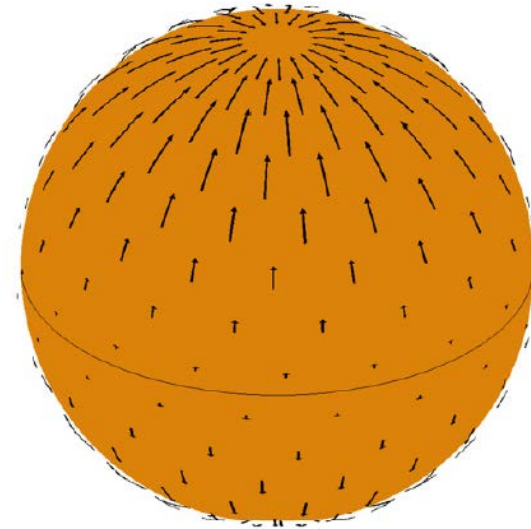
# Meridional circulation

## Solar case

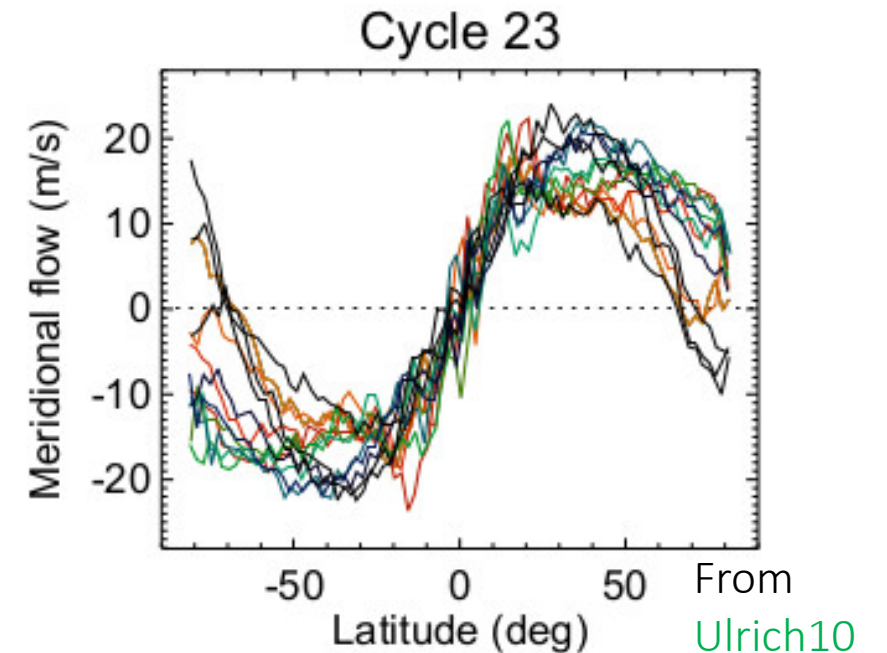
- Large scale flow
- Poleward
- Amplitude max  $\sim 10\text{-}20$  m/s
- Related to differential rotation and transport of angular momentum
- Variability over the cycle [Komm+93](#), [Meunier+99](#) + many other references

## Stellar case

- No observational constrain
- Theoretical predictions
  - Smaller for fast rotators [Ballot+07](#), [Brun+17](#)
  - Smaller for low masses [Matt+11](#), [Brun+17](#)
  - May be multicells [Matt+11](#), [Guerrero 13,16](#)



[Makarov+10](#)

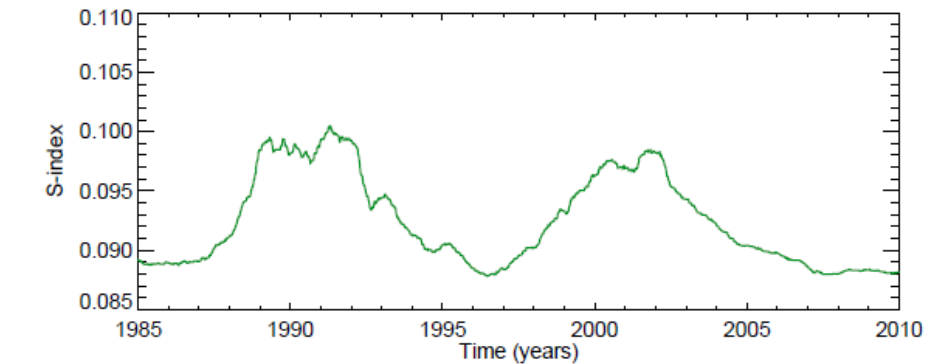
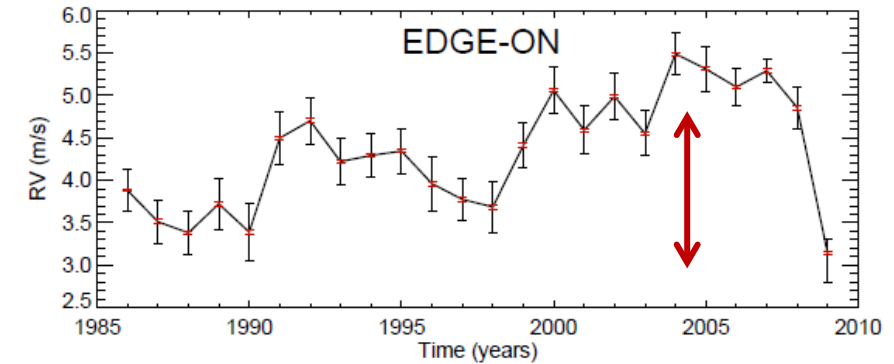
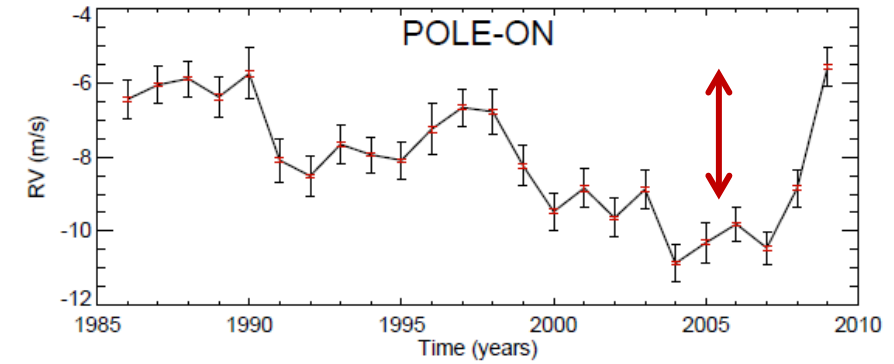
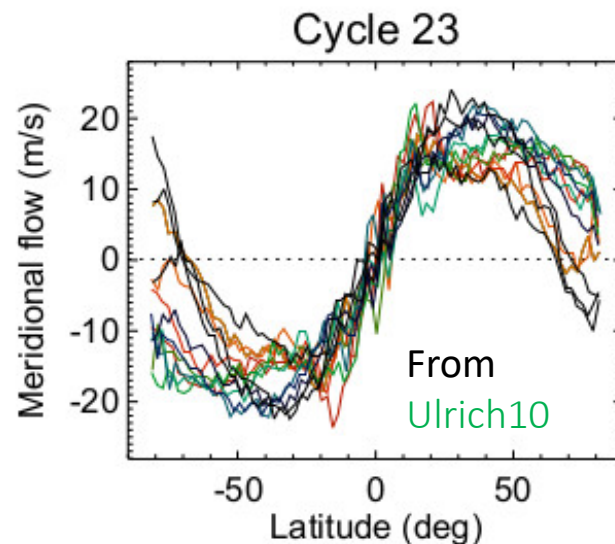
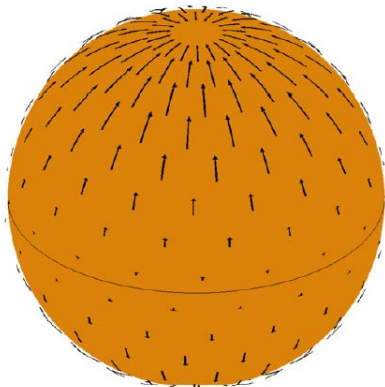


# Meridional circulation

Variable solar meridional circulation

Impact of meridional circulation on RV

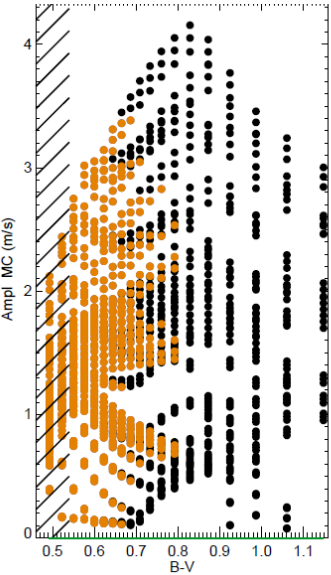
- Solar, edge-on: [Makarov 10](#) (mixed with other processes)
- Inclination  $\rightarrow$  reversal in sign
- New reconstruction :
  - $\sim 1$  m/s edge-on
  - $\sim 2$  m/s pole-on rms ([Meunier+20](#))



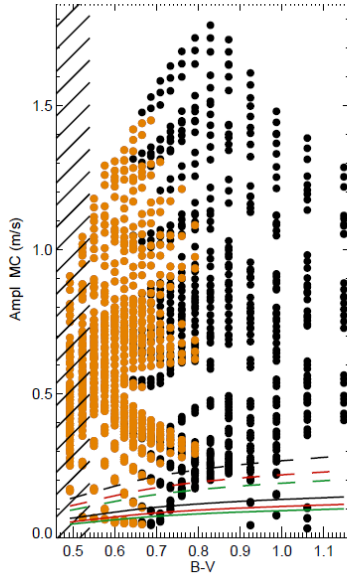
Meunier+20a

# Expected stellar amplitudes

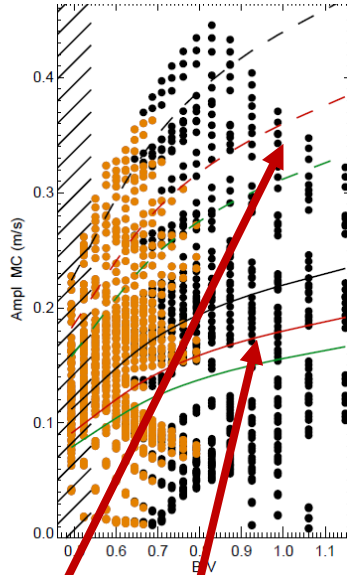
0° (pole-on)



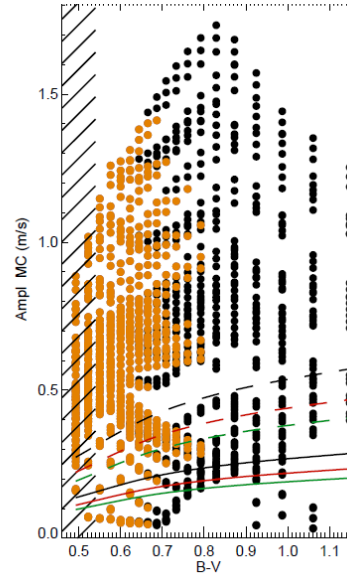
30°



55°



90° (edge-on)



Fast rotators  
Slow rotators  
Meunier+20

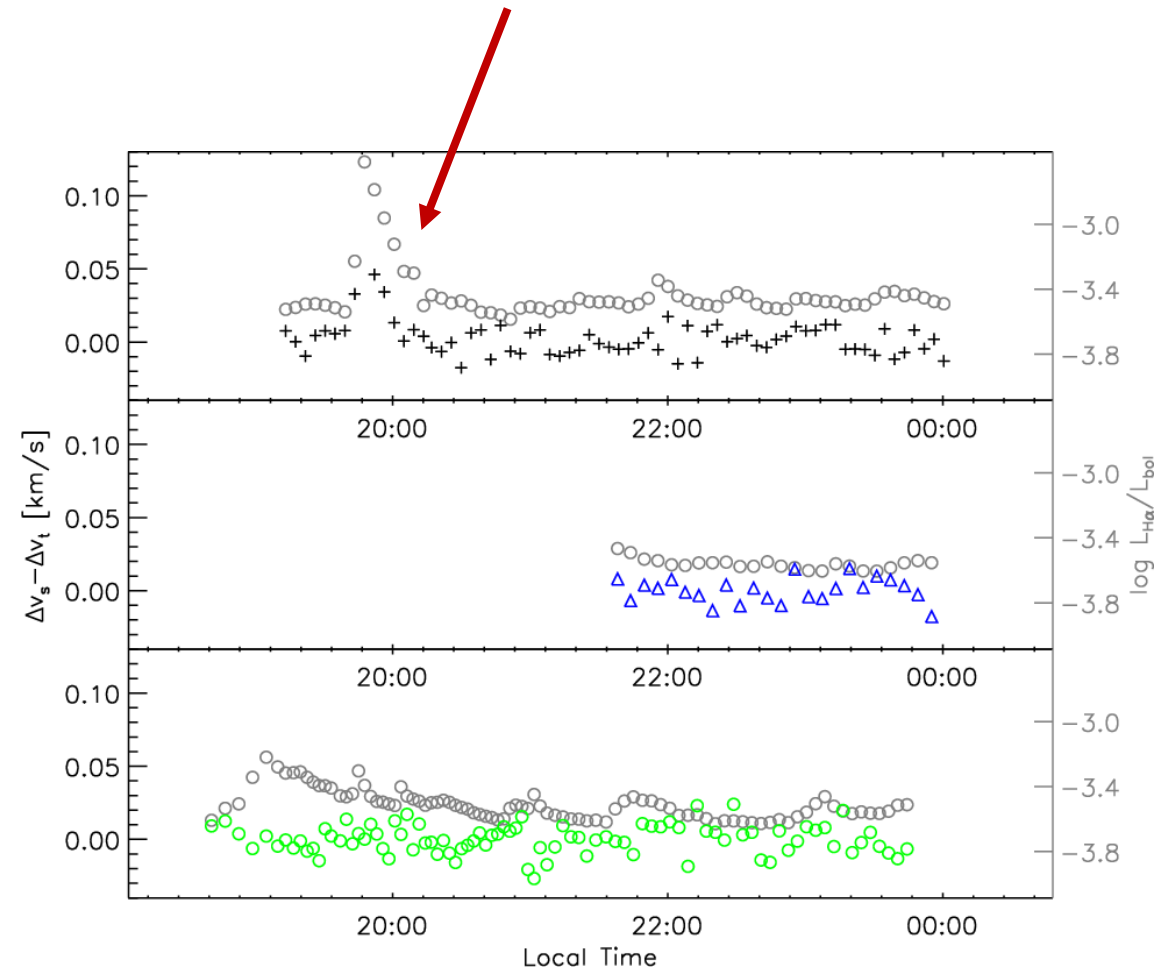
2 M<sub>Earth</sub> 1 M<sub>Earth</sub>

Smaller for fast rotators  
Ballot+07, Brun+17  
& multicells Matt+11, Guerrero  
13,16  
Smaller for low masses Matt+11,  
Brun+17  
Scaling on cycle amplitude  
→ ~ 0.1-4 m/s

# Flares

Need to be major to impact RV

- Negligible for G stars (Saar+18)
- Impact a large fraction of M stars, major flares exist
- Often appears as outliers given the temporal sampling



Reiners+09

# RV summary

## Many sources, at various scales

- Several contributions in the 0.3-1 m/s range
- Complex for solar-type stars
- May be more stable for young stars or some M stars

## Complexity

- Activity pattern
- Differential rotation
- Finite lifetime of spots/faculae + evolution of structures
- Sum of different individual contributions → strong degeneracies
- Large range of sizes and timescales

## Importance of the temporal sampling

# Correction methods: RV

See also Zhao+22, Hara&Ford+24

## Based on RV time series

### SPOTS/PLAGES

Fits of sinusoids / harmonics Boisse+11

Prewhitening at Prot Queloz 09, Hatzes+ 10

Spot modeling Moulds+ 13 Dumusque+14 Herrero+16

### OSCILLATIONS/GRANULATION

Averaging (for oscillation/granulation) Dumusque+ 11

Meunier+15

Periodogram standardization (MHD sim. granulation) & error propagation Sulis+17,20,22

## Using different sets of RVs (spectral level)

Using selected sets of lines (depths) Meunier+ 17

Combining different line properties Dumusque+18, Crétignier+20

Using different parts of the lines (Teff) Al Moulla+22

Selection of lines minimisation RV signal Belotti+22

Wavelength dependence/chromatic index e.g. Tal-Or+ 18

## Using other indicators

### from the spectra

⇒ *cross-correlation function (CCF, ~average line) or full spectra [not exhaustive]*

⇒ *Associated to search for new activity indicators (lines, IR)*

Correlation with line bisector span(+) Desort+ 07, Boisse+ 09

Chromospheric emission Boisse+09, Pont+10, Dumusque+12, Meunier+ 13, Robertson+14, Rajpaul+15, Lanza+16, Borgniet+17 incl. Non-linear relationship Meunier+19,24

Gaussian processes (simple, multivariate...) Rajpaul+ 15,20, Dumusque+17, Damasso+17, Barragan+19,22 ...

PCA Davis+17, Crétignier+23 (YARARA)

Doppler imaging Hebrard+16 ...

Shift&Shape SCALPELS Collier-Cameron+21 FIESTA Zhao&Ford22

ML (linear regression, NN) DeBeurs+22, Perger+23... =>

*next lecture*

...

## Using other indicators

FF' method using photometry Aigrain+12 + multi-GPs<sub>72</sub>



# Focus on gaussian processes (GPs)

Non parametric method Rasmussen & Williams 2006

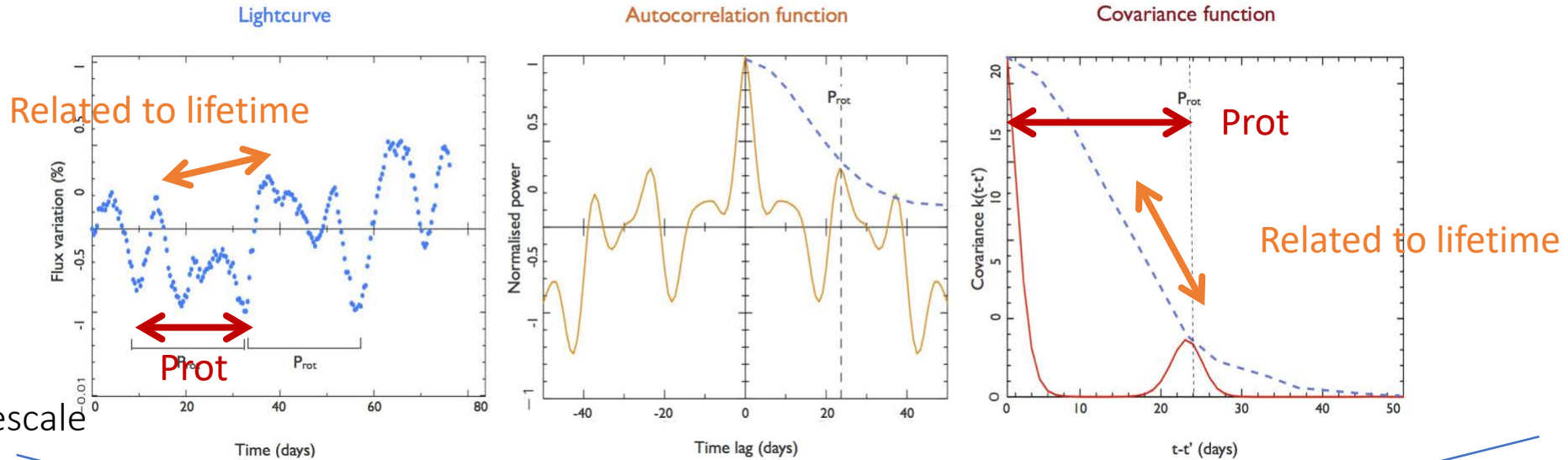
Replacing a parametric function => flexibility given the stochastic nature of stellar activity (can usually not be fitted with strictly periodic function for example)

General principle of a GP

- Describe how two values ( $R_V, \dots$ ) at  $t$  and  $t'$  are *correlated* (i.e. value at  $t$  => most probable value at  $t'$ ?) => relation described by a **covariance function**
- Parameters of the covariance function= hyperparameters
- Adjustment of the hyperparameters on the time series => Can be used to compute **covariance matrix**
- Allow to derive most probable value + uncertainty (including for interpolation)

See Haywood 2014 (PhD) chapter 2 for very clear description

# Main implementation: rotational modulation



Evolution timescale

Amplitude

Recurrence timescale  $\sim$ Prot

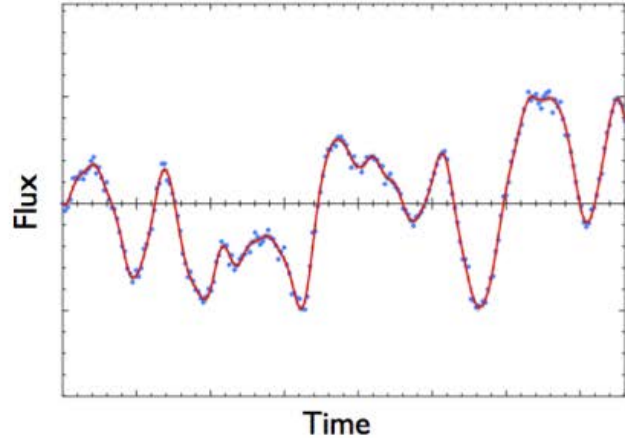
Relative importance of evolution vs. periodicity

$$k(t, t') = \theta_1^2 \cdot \exp \left[ -\frac{(t - t')^2}{\theta_2^2} - \frac{\sin^2 \left( \frac{\pi(t - t')}{\theta_3} \right)}{\theta_4^2} \right] + \sigma_i^2 \cdot \delta_{tt'}$$

Quasi-periodic function (variants exists)

Usually include a white noise term

(a)  
Lightcurve:  
naturally has covariance  
properties of star's  
magnetic activity

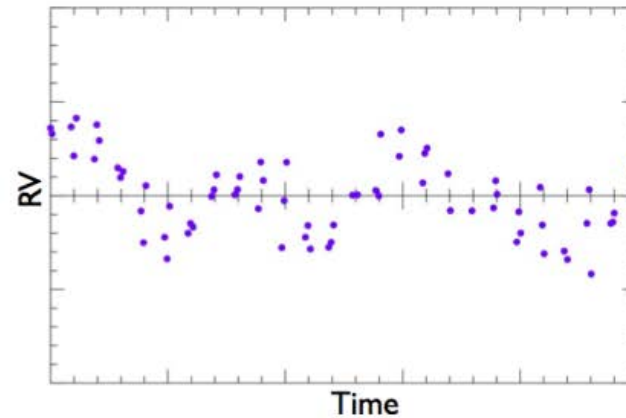


(b)  
train GP: determine  $\theta_1, \theta_2, \theta_3, \theta_4$   
of covariance function through  
MCMC simulation

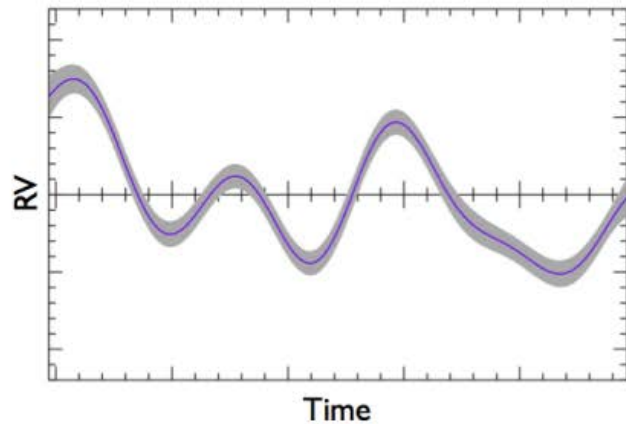


Determine covariance  
function  $k(t, t')$

+

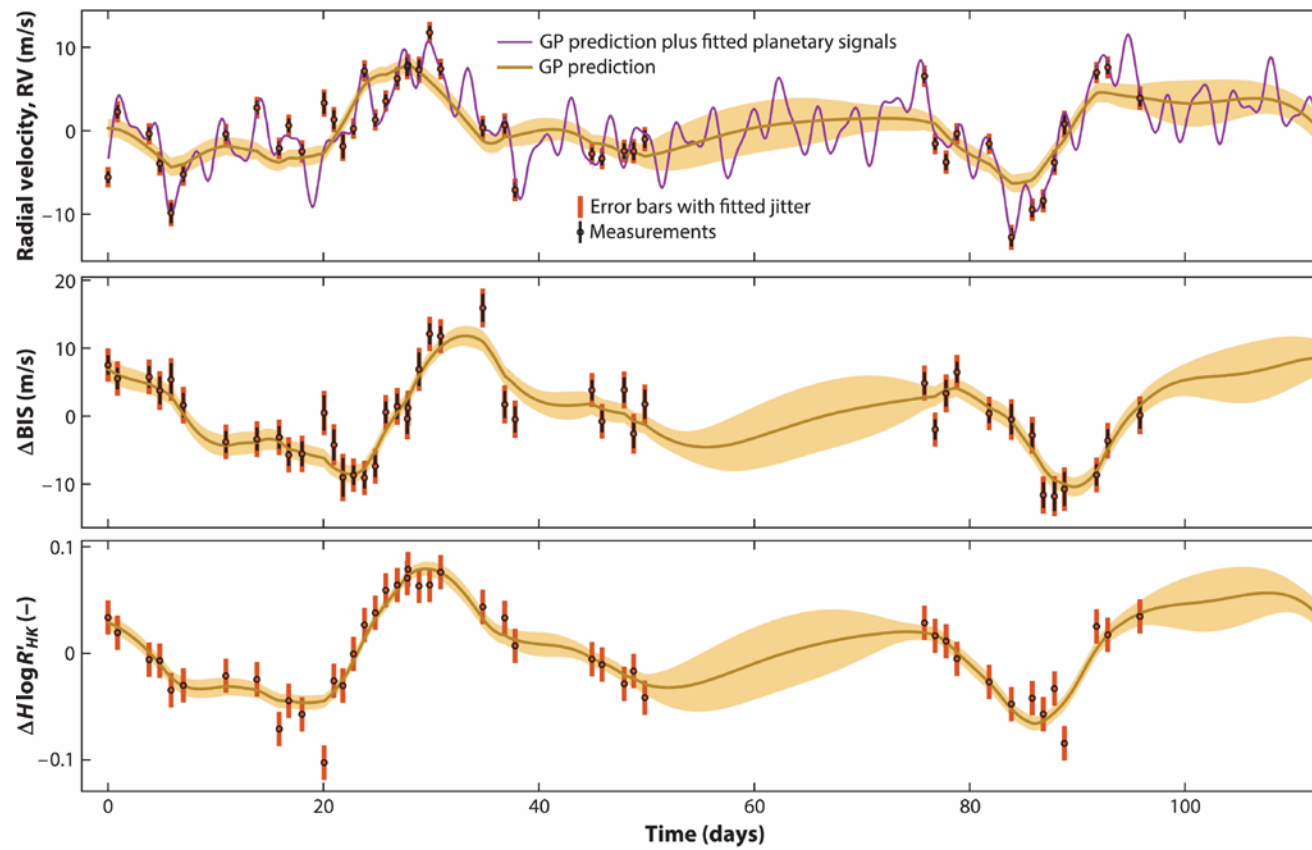


(c)  
predict GP: compute  
covariance matrix  
using  $k(t, t')$



(d)  $RV_{\text{activity}}$ : basis function with  
covariance properties of lightcurve

Training on observables  
which does not include any  
planetary signal: (out-of-  
transit) LC,  $\log R'_{\text{HK}}$ , BIS ...  
**Assume have same  
covariance function**



# Current status

## Evolution over the last decade

- Used in many studies, see methods in [Rajpaul+ 15,20](#), [Dumusque+17](#), [Damasso+17](#), [Jones+17](#), [Barragan+19,22](#) ...
- On RVs: need to apply GP+Keplerian at the same time (otherwise flexibility leads to planetary absorption in the GP)
- Development of more sophisticated tools, including multi-variate GPs = fit on RV + indicators simultaneously
- Openings to include other contributions than rotational modulation, with different covariance functions (but not always analytical form possible)

## Open source codes [not exhaustive]

- package george ([Ambikasaran et al. 2015](#))
- RadVel package ([Fulton et al. 2018](#))
- Pyaneti ([Barragan+19,22](#))
- ...
- **Question:**
  - Can the flexibility absorb the planetary signal? (in particular at  $P_{orb} > P_{rot}$ )

# Many methods, but some limitations

All reduce the RV jitter due to the stellar signal to some level

Importance of blind tests (see appendix for details), e.g.:

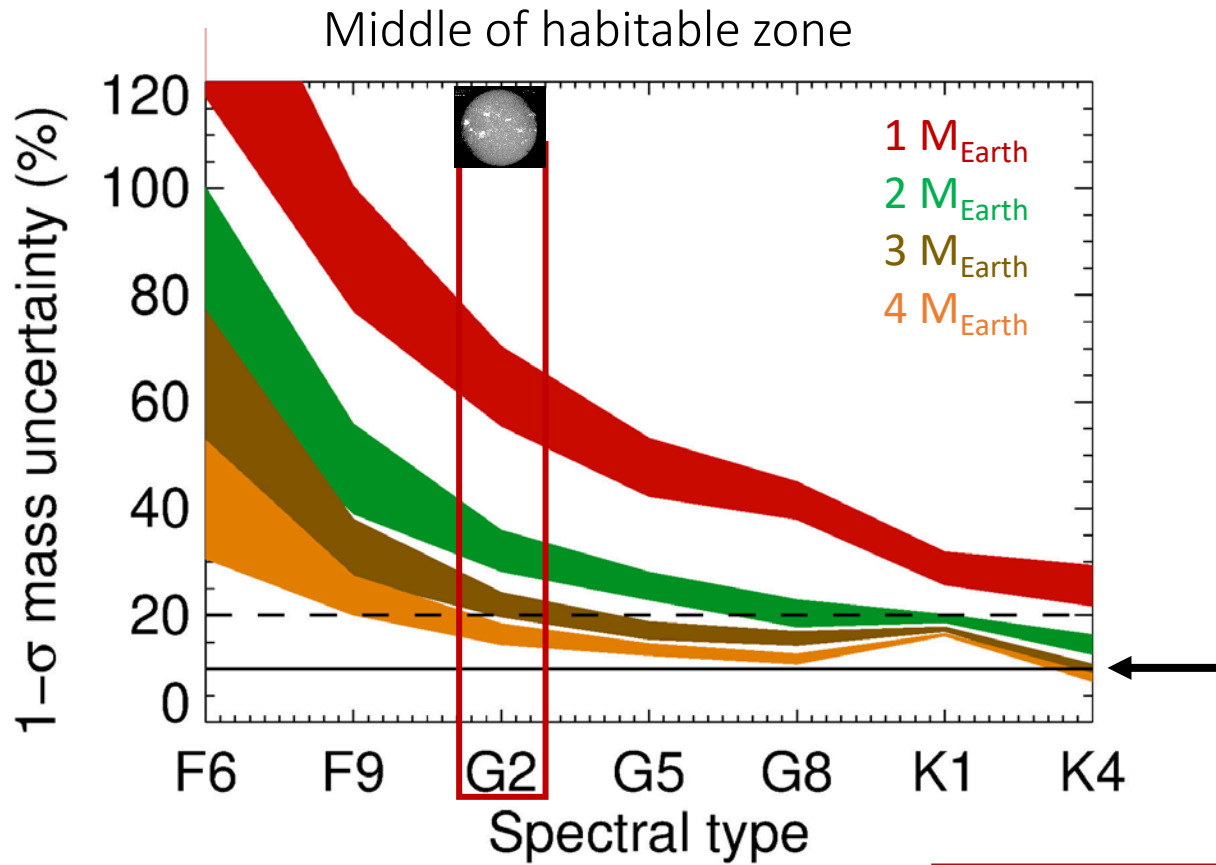
- [Dumusque+16,17](#): data challenge on a few time series, 8 teams (blind search)
- [Meunier+19,21](#): large scale, on flows only (granulation, supergranulation) => two types of blind tests (RV follow-up and blind search)
- [Meunier+24](#): large scale, magnetic activity+flows (RV follow-up and blind search)

Residual jitter still too high to allow the detection of a one Earth planet in the habitable zone of a solar type star

What is the reliability of the residuals?  
Do we introduce spurious « planetary » signal?  
Do we remove part of the planetary signal?  
Do we propagate properly the errors and control the false alarm probabilities (see [Sulis+20,22](#), [Hara+20](#))

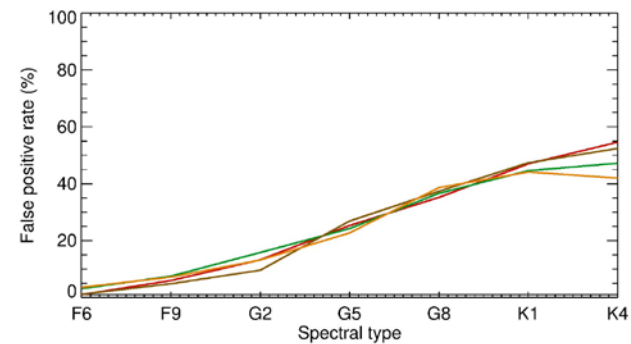
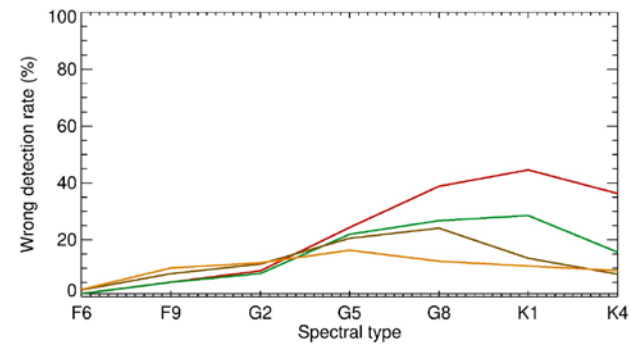
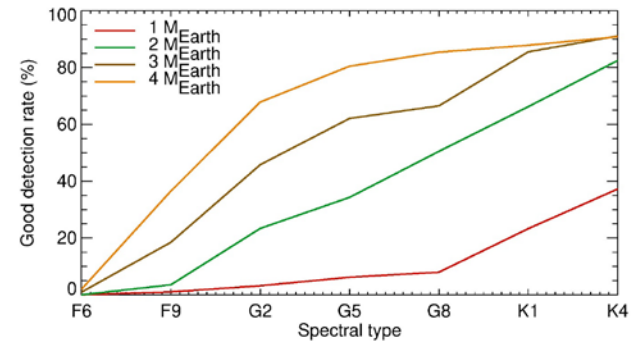
# Follow-up of a transit detection

# Search for planets



Meunier+23

Rms of residuals and fap not reliable



# Effect on (broad-band) photometric transits

## 3 main sources

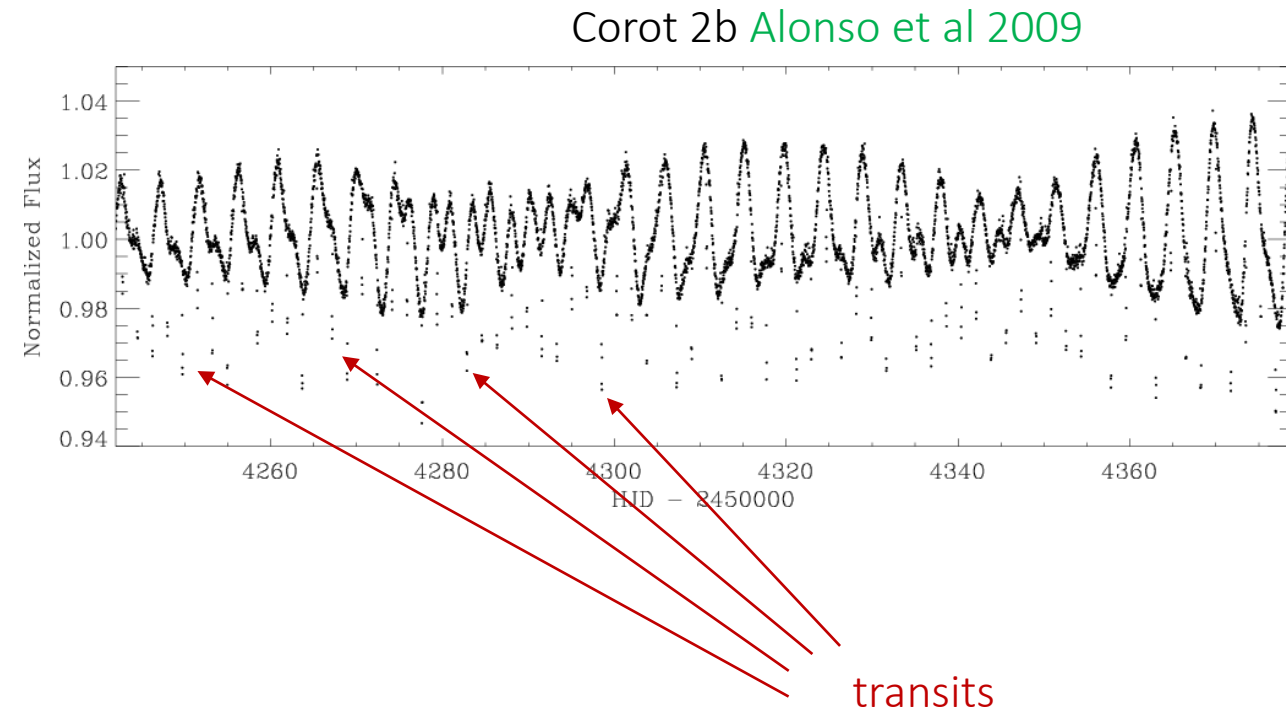
- Unocculted spots and faculae during the transit
- Occulted spots and faculae during the transit
- Stellar granulation

## Not forgetting

- Flares => often removed before searching for transits, but small residuals may remain
- Issues with stellar properties not directly related to variability (limb-darkening law, including impact of spot)

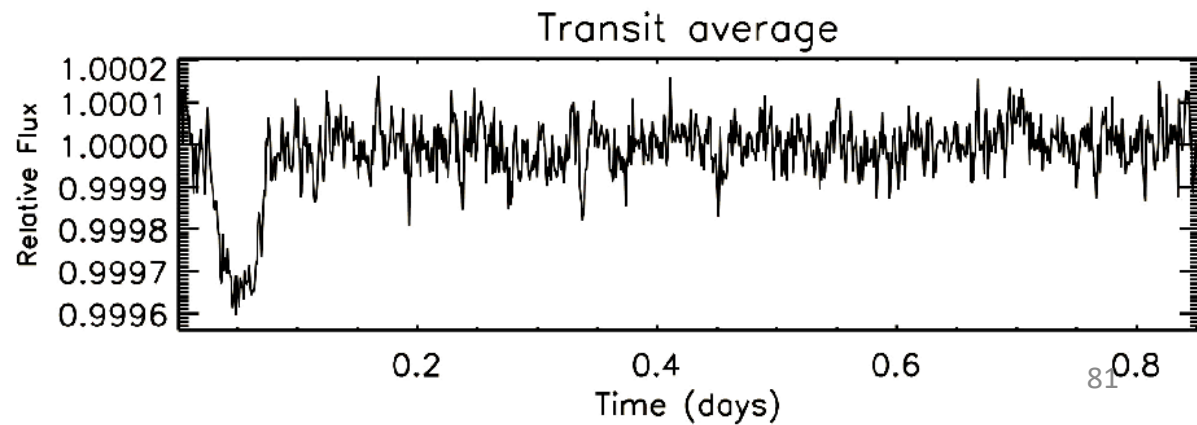
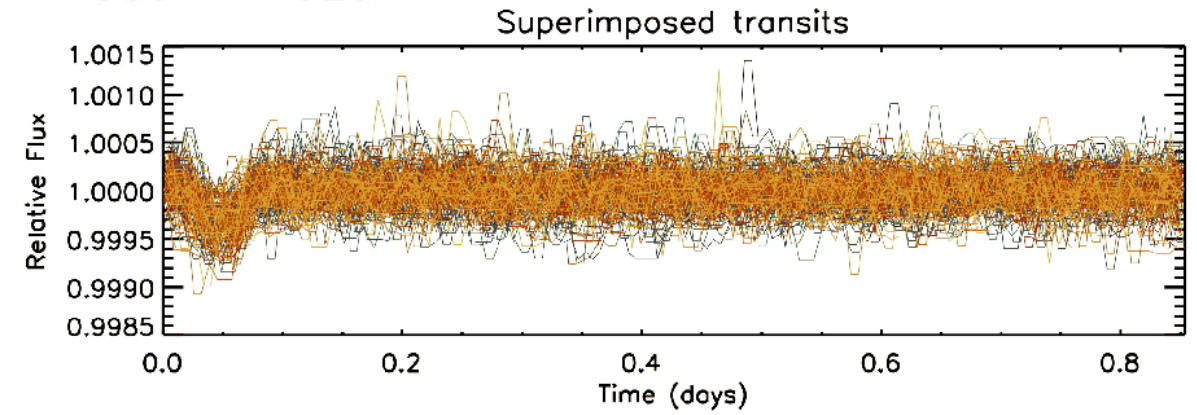
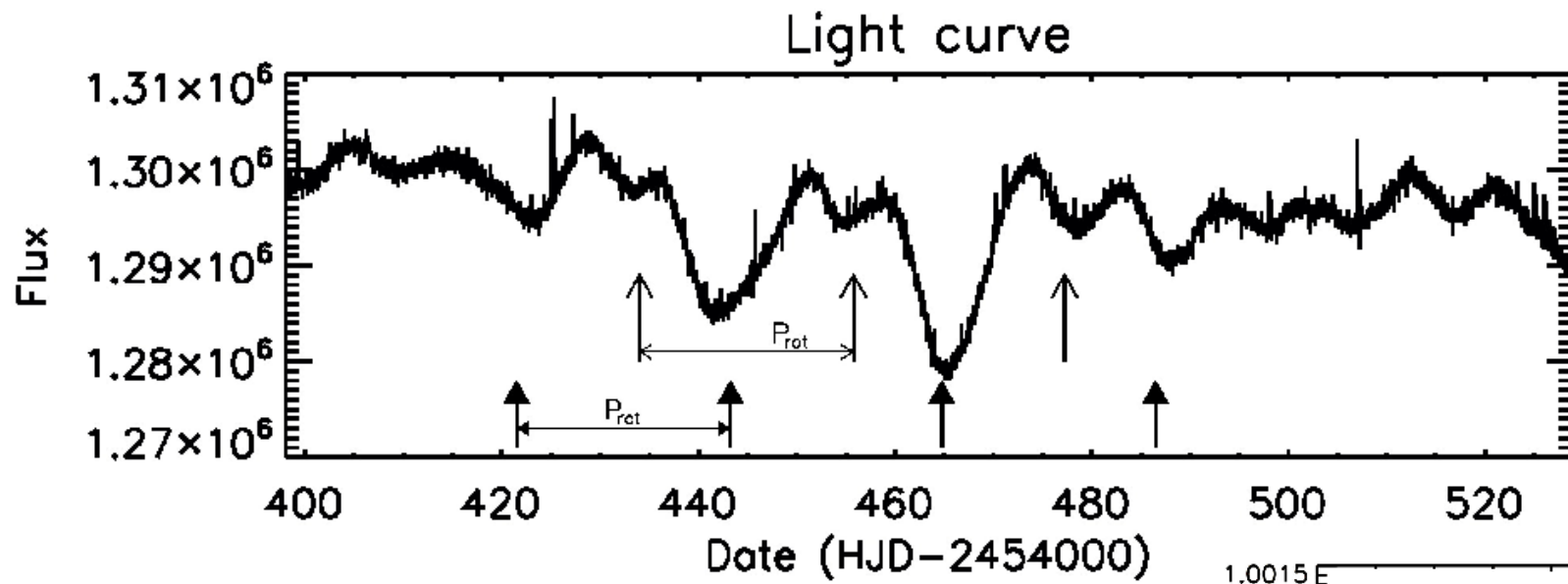
## Impact on

- Detection
- Transit depth
- Mid-transit time, certain orbital parameters (Barros+13)



See [Bruno&Deleuil 21](#) for a review





Corot 7-b

[Léger et al 2009](#)

Several low-pass and high-pass filtering

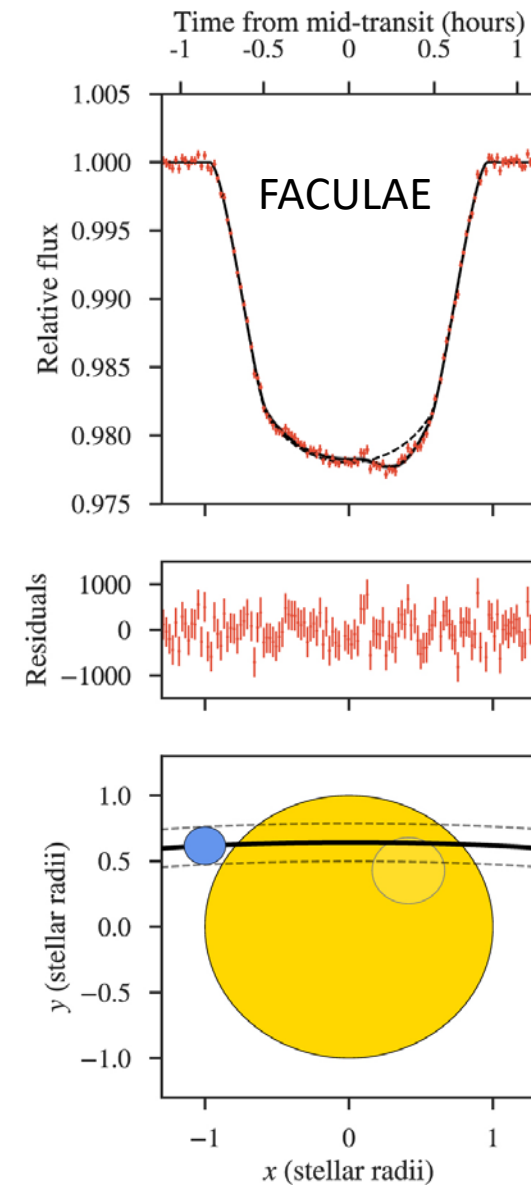
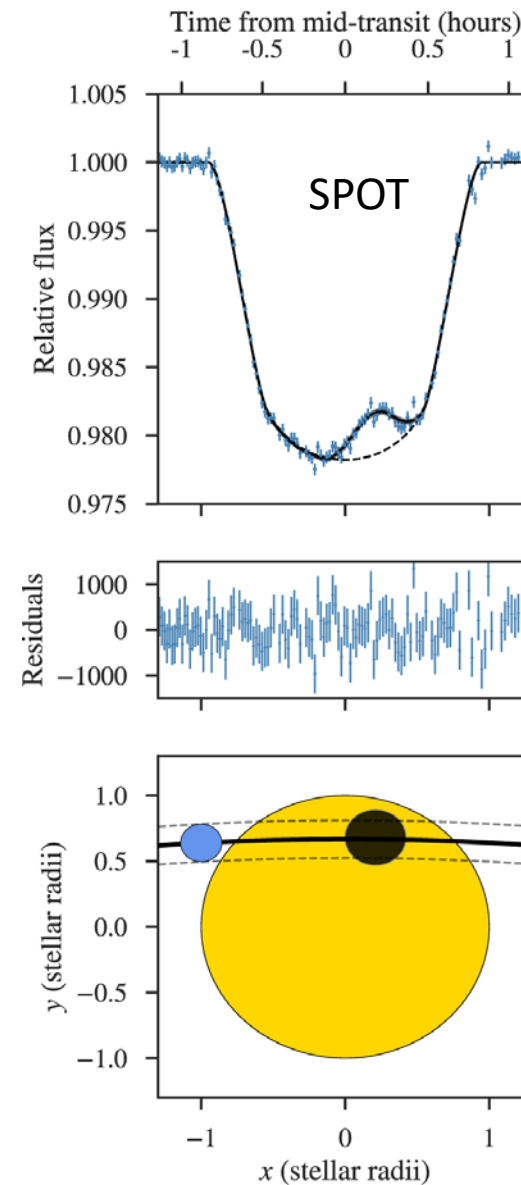
# Un-occulted spots and faculae

$$\textit{Transit depth} = \frac{F_{out} - F_{in}}{F_{out}} = \left( \frac{r_{pla}}{R_{star}} \right)^2$$

- $F_{out}$  = reference, supposed to be the star with no spot of facula / different level + variability during transit => strong impact on transit depth
- Photometric variation ~ a few 100 ppm - a few %
- Suggestion to use unaffected  $F_{out}$  but level unknown

# Occulted spots and faculae

- Produce bumps in the transit LCs
  - If many structures + noise => distortions in the LCs that may be difficult to identify (Ballerini+12,Czesla+09,Silva-Valio+10)
- Ex of Corot2b: if assume only dark spots, radius may be overestimated by up to 3% (but less if faculae present, Bruno+16)
- Very interesting for stellar physics: can lift degeneracies
  - Latitude
  - Longitude
  - size & temperature



Espinoza+19  
WASP-19b

Another example with a very large polar spot

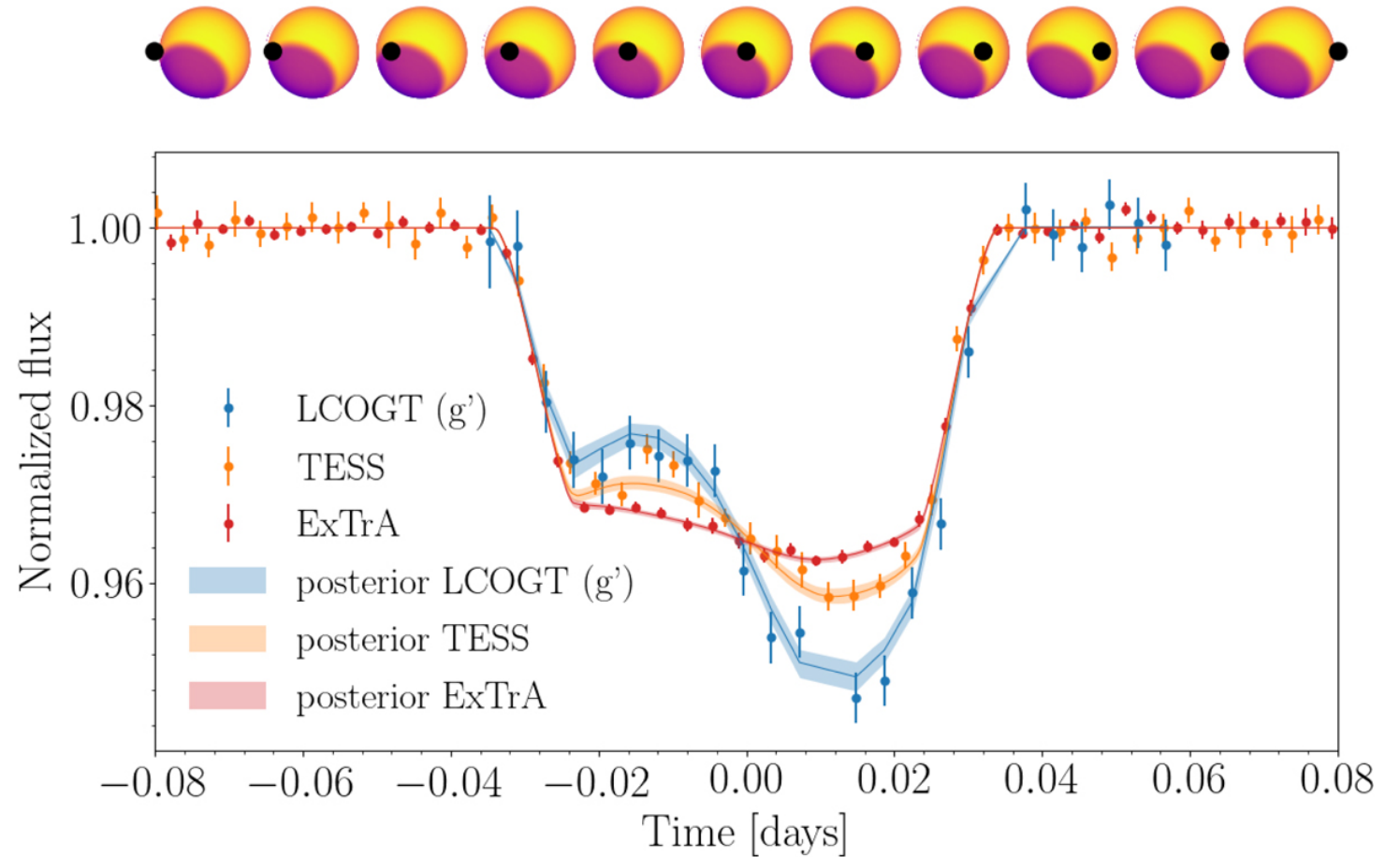
Almenara+22

TOI-3884b

5-min binned LCs

Strong chromatic effects

- TESS 0.6-1  $\mu\text{m}$
- ExTrA 0.88-1.55  $\mu\text{m}$
- LCOGT  $\sim 0.464 \mu\text{m}$  ( $g'$ )



# Correction methods: photometric transits

## Un-occulted spots and faculae

- Spot/faculae modelling (without the transit) => subtraction (fast)
- GP modelling (kernel rotational modulation) => subtraction ([Haywood+14](#) and later works) (more time consuming)
- Simultaneous modelling of spot/faculae+transit ([Bruno+16](#))

## Occulted spots and faculae

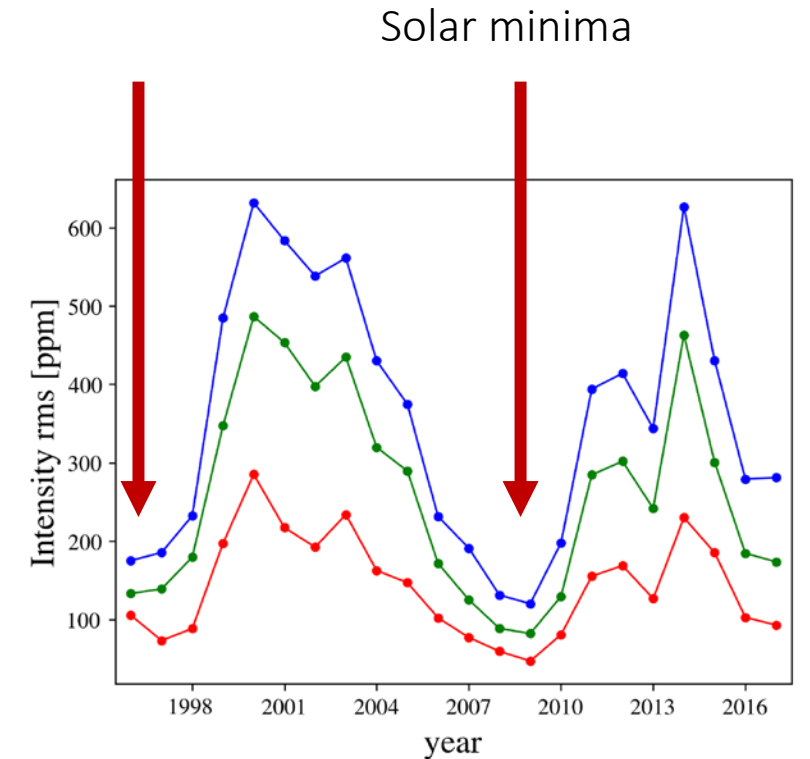
- Need specific in-transit spot modelling (e.g. [Silva-Valio+08](#) and more recent works)
- => + stellar results on sizes and contrasts

Warning about spot modelling = strong degeneracie, unspotted level can not be determined

[Walkowicz+13](#), [Basri+18](#), [Lüger+21](#)

# Granulation

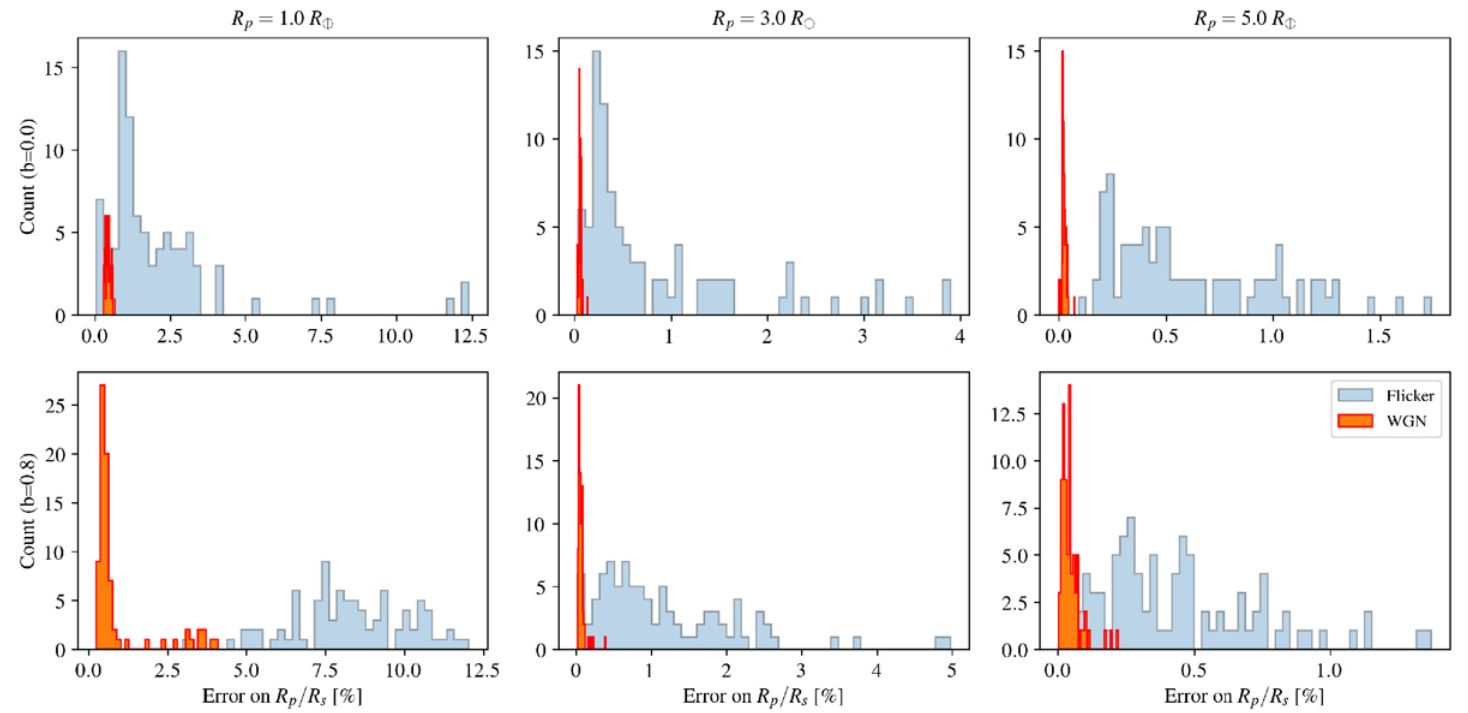
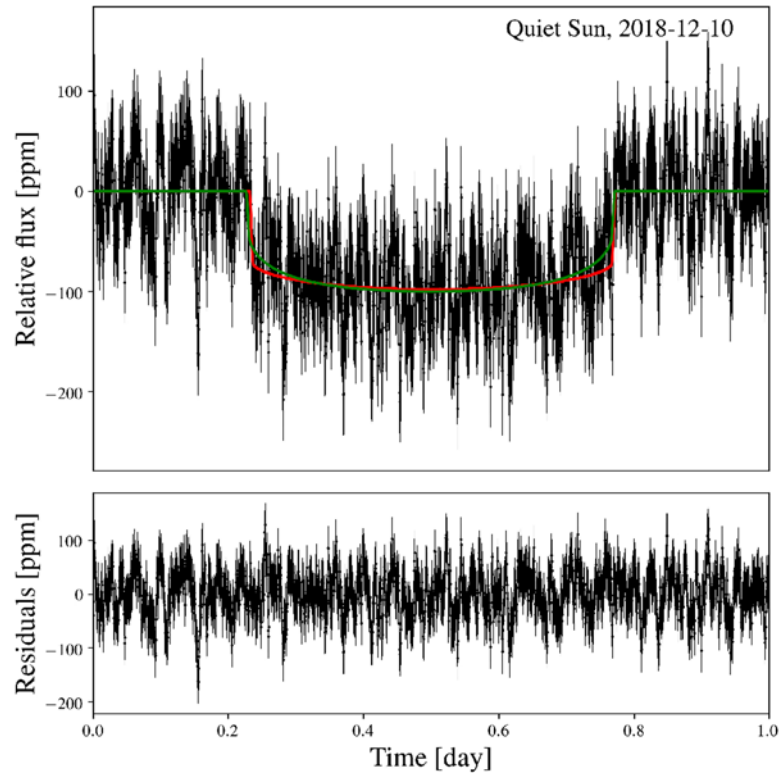
- First estimation led to small impact **Chiavassa+17**
  - MHD simulation of granulation + paving of the surface
  - Hot Jupiter, Hot Neptune, terrestrial planet
  - Photometric variability 1-16 ppm a bit low compared to the Sun
  - Larger impact on radius for G compared to K : 0.9% and 0.45%
  - Larger in the visible
- **Sulis+20** => stronger impact, up to 10%
  - Based on solar observation + MHD simulations
- => included in error budget (CHEOPS, PLATO...)



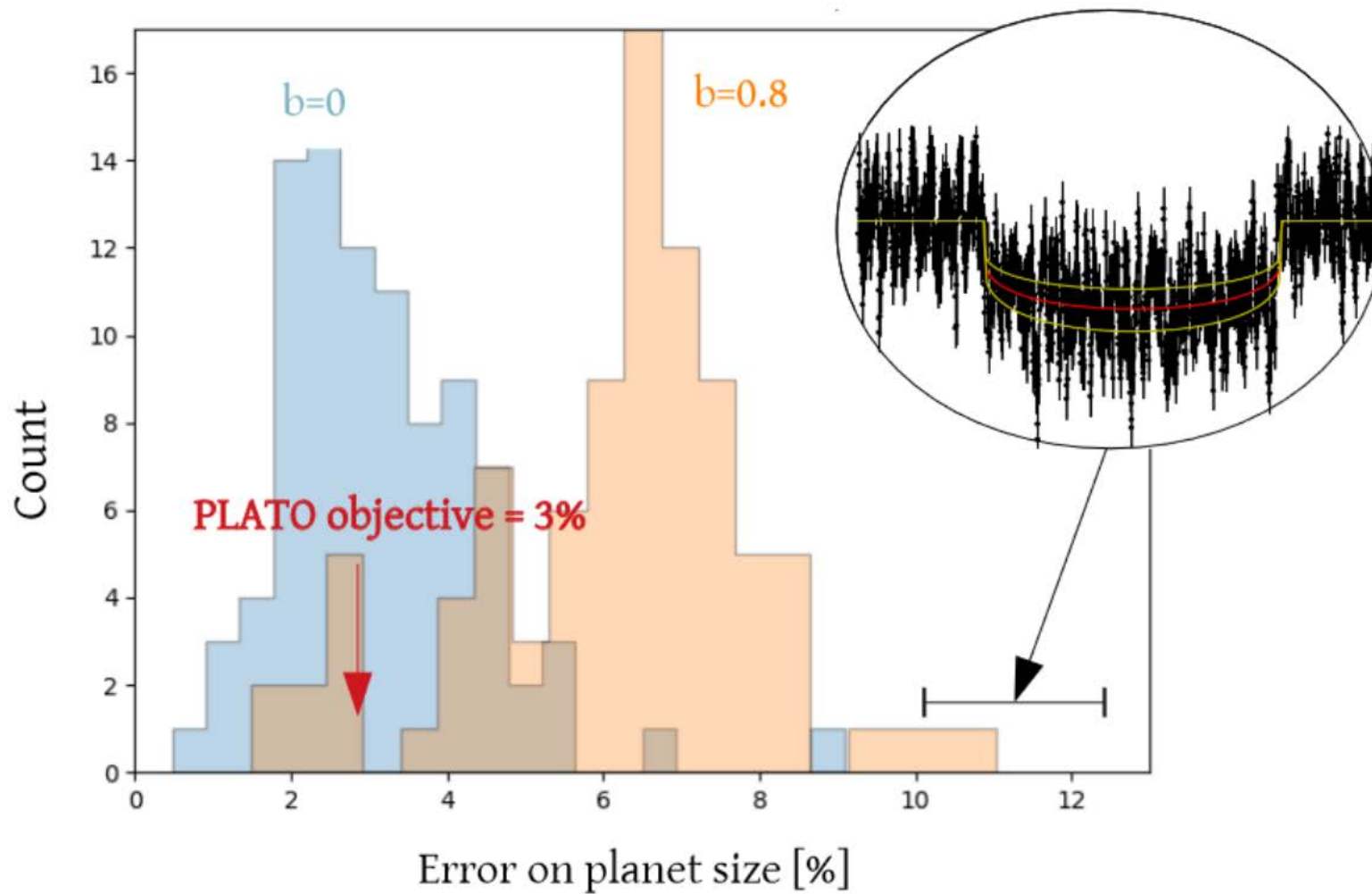
**Sulis+20**

VIRGO/SOHO: red, green and blue channels

# Eart-like transit



Sulis+20



Sulis+20



# Effect on atmosphere characterisation: transmission spectroscopy

Extension of the photometric transit => function of wavelength (+time)

- Like detection: can hide or mimic planetary signal
- Can dominate over planetary absorption features for terrestrial planets

Wide range of wavelengths

- HST, Spitzer, various ground-based telescopes, JWST (ARIEL)
- Mostly for giant planets => towards rocky planets

Main processes

- Spots, faculae
- Granulation
- Flares

Rackam+18 (M dwarfs) and Rackham+19 (FGK) for thorough analysis; Pont+08, Sing+11  
Rackham+23 : Study Analysis Group 21 (SAG21) of NASA's Exoplanet Exploration Program Analysis Group (ExoPAG)

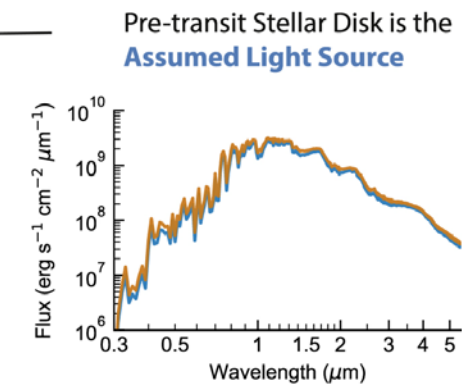
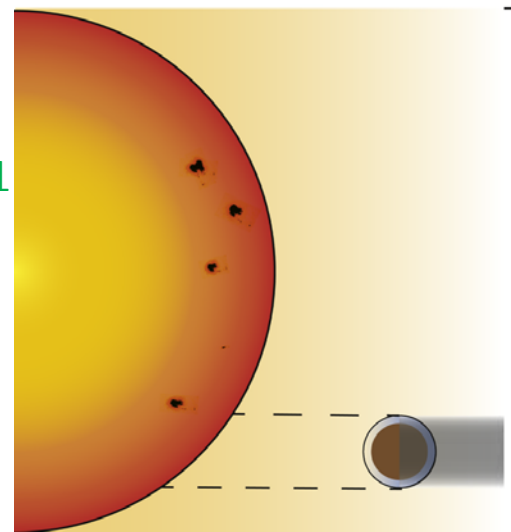
Contrast vs  $\lambda$   
Spectral features

$$D_{\lambda, \text{obs}} = \frac{D_{\lambda}}{1 - f_{\text{het}} \left( 1 - \frac{F_{\lambda, \text{het}}}{F_{\lambda, \text{phot}}} \right)},$$

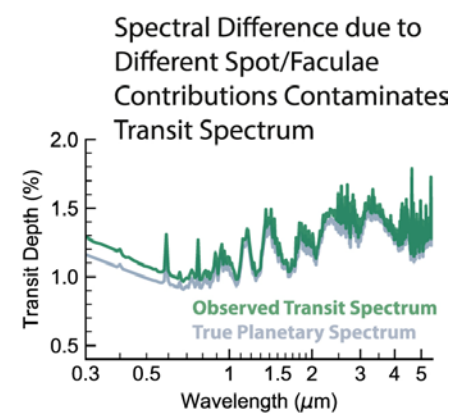


The Transit Light Source Effect

Rackham+18

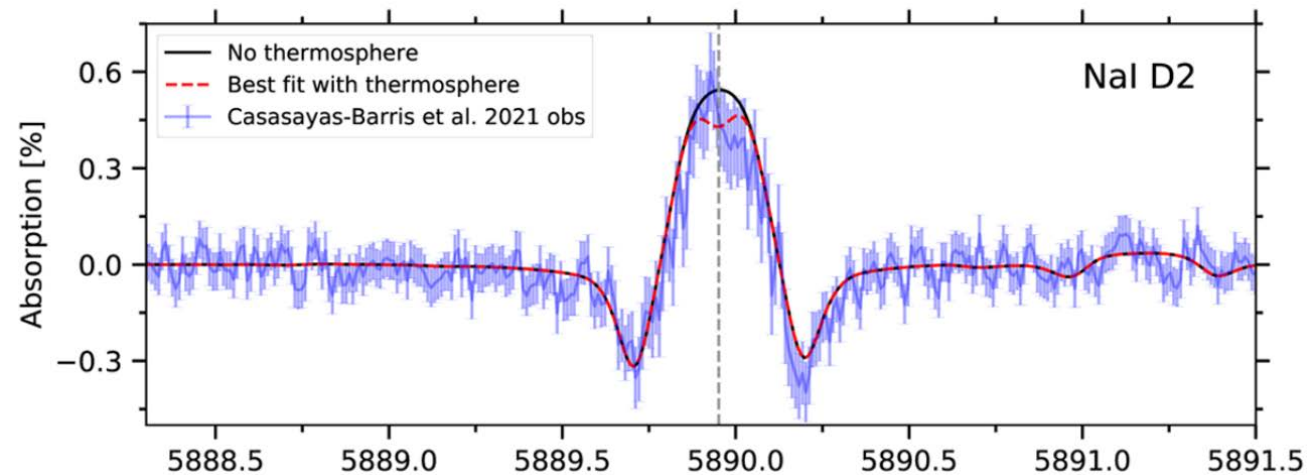
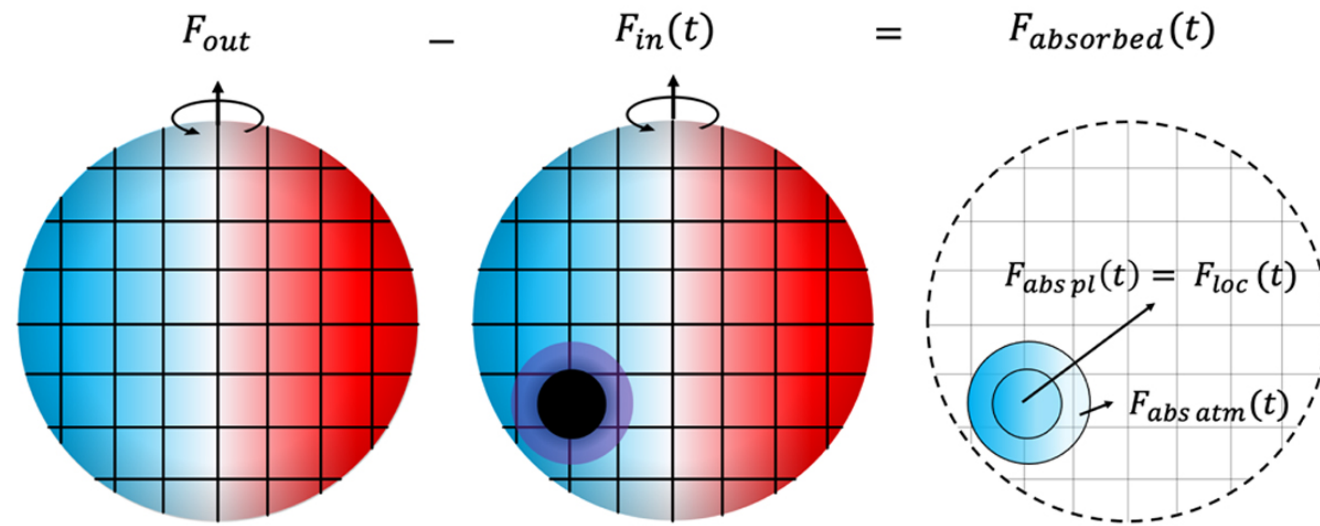


Actual Light Source is the Chord Defined by the Planet's Projection



Spectral Difference due to Different Spot/Faculae Contributions Contaminates Transit Spectrum

Even with no structures:  
potential impact of rotation  
(fast rotators) + CLV (slow  
rotators)



Dethier&Bourrier22  
ESPRESSO

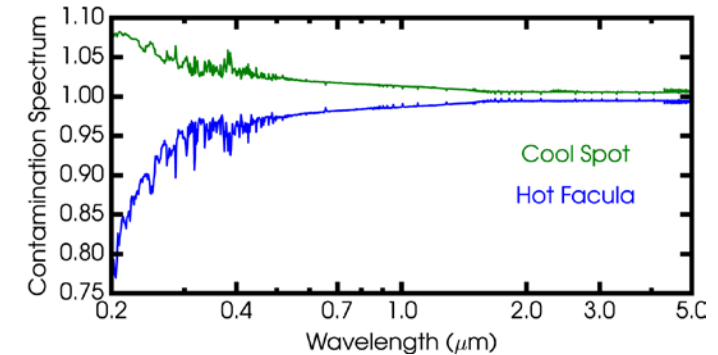
HD 209458 b computed with the out-of-transit spectrum as a function of the wavelength in the planetary rest frame with and without sodium atmosphere

# Unocculted features

Pinhas+18

T contrast 300K, f=10%  
unocculted

- Contrast depends on  $\lambda$
- Unocculted spots
  - positive features in transmission spectra that may be mistaken for evidence of absorption or scattering in the exoplanet atmosphere.
- Unocculted faculae
  - negative features, which can mask genuine spectral features originating in the exoplanet atmosphere
- Flare => also bumps as occulted features (Lim+23 on TRAPPIST-1)
- Granulation:
  - Adds noise to the light curves
  - Different granulation realisations between full disk and occulted area



Spectral features, ex. H<sub>2</sub>O present in sunspots at T<3000K (Wallace+95, Wöhl71), can mimic water absorption at ~1.4 m and 2.3 m (Wakeford+19)

See also TiO (Neff+95) and other molecules metal hydrides, oxides, CNO-based molecules (Berdyugina05,11 ; Cauley+18, Saba+24)

# Forward modelling for M dwarfs

Rackham+18

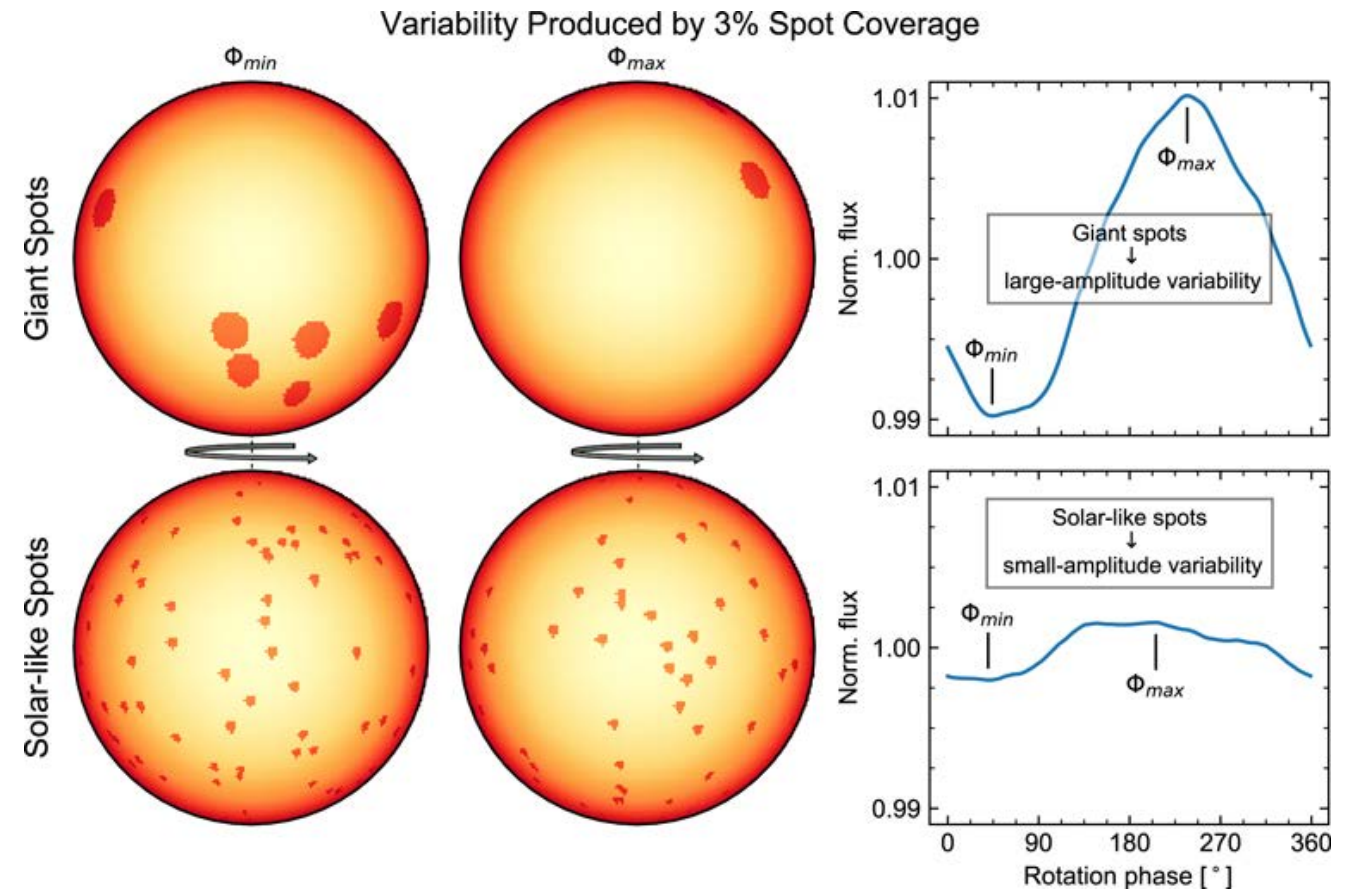
Model with **giant spot or multiple small spots for a given flux variability**

Without or with faculae (ratio~10)

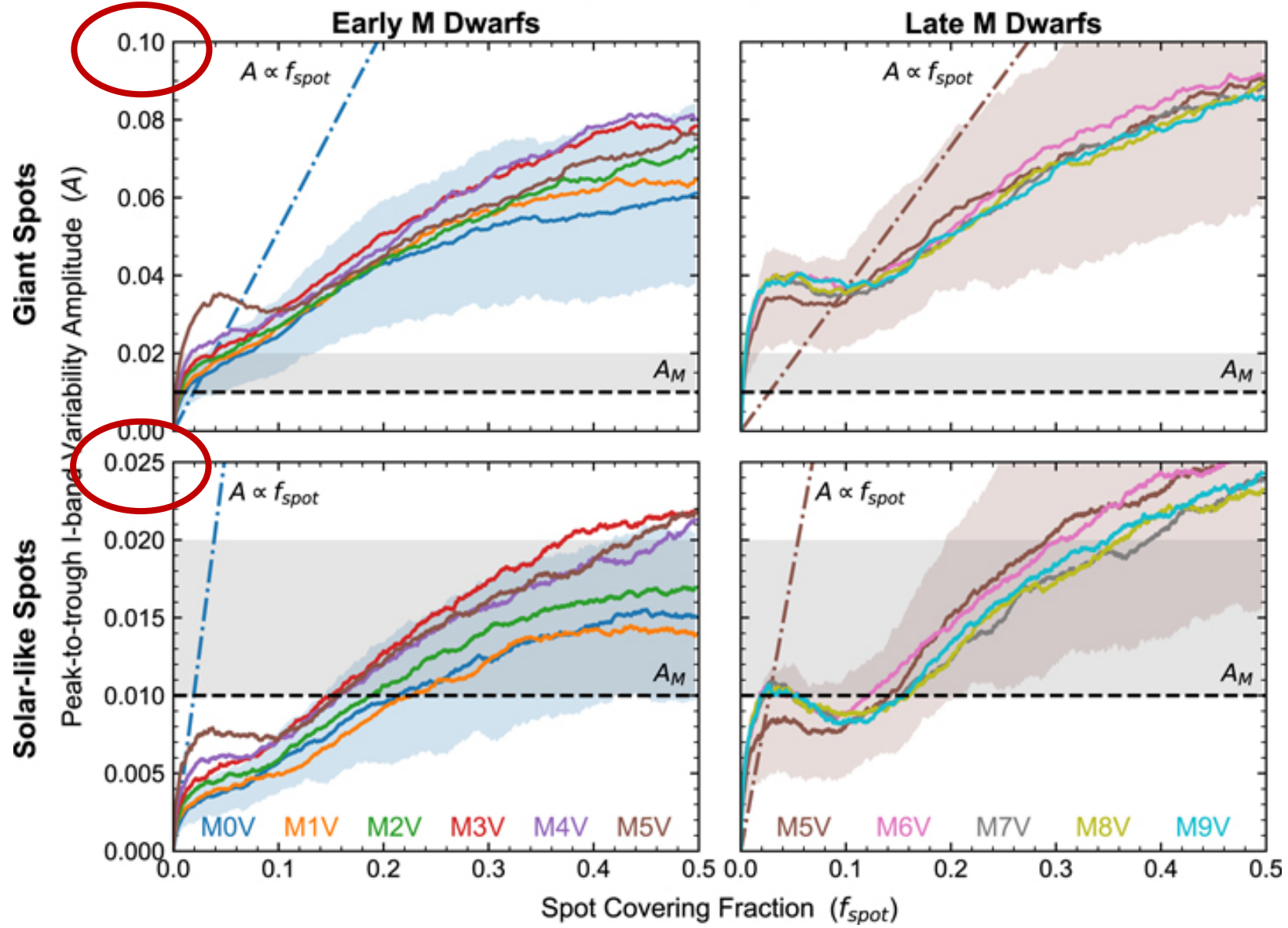
Based on PHOENIX models, neglecting impact of magnetic field or limb distance

For the same  $f_{spot}$

- variability depends **on size**
- variability not affected by constant level of structures spread everywhere (**axisymmetric component does not affect variability but will affect spectra!**)



# Variability Amplitudes of Spots+Faculae Models



Assuming linear relation between coverage and amplitude of variability = poor approximation

Strong dispersion (not a one-to-one relation)

Rackham+18

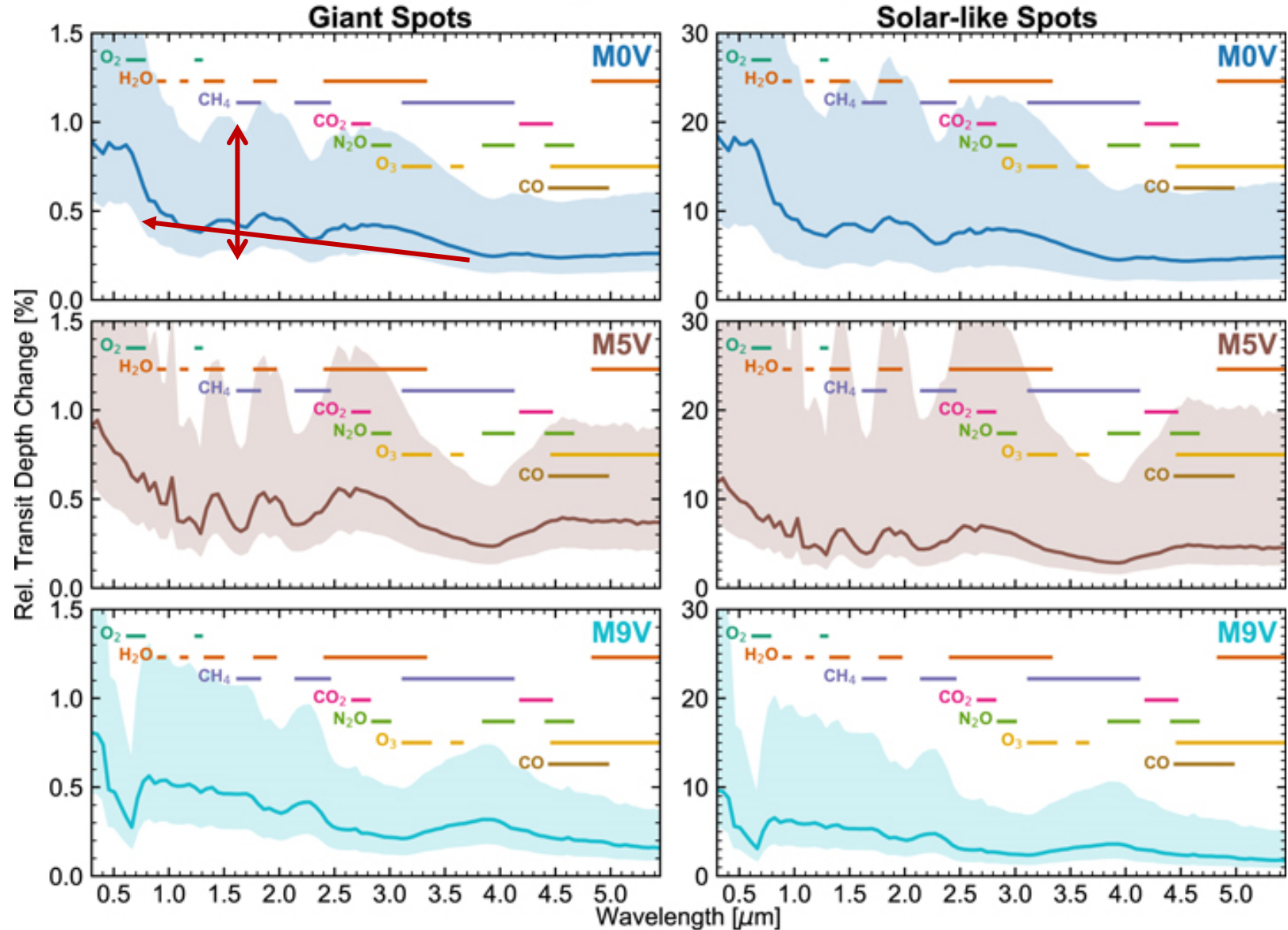
Impact of plage addition: small plateau at low  $f_{spot}$

Rackham+18

## Stellar Contamination Spectra Produced by Spots-Only Models

Increase in transit depth largest at low  $\lambda$   
Impact molecular bands

Spot size (for a given observed variability amplitude) has a strong impact: below  $<1\%$  for giant spots, up to 30% for small (more numerous) spots  
Solar-like spots  $\Rightarrow$  increase of transit depth  $>$  expected for exoplanet features



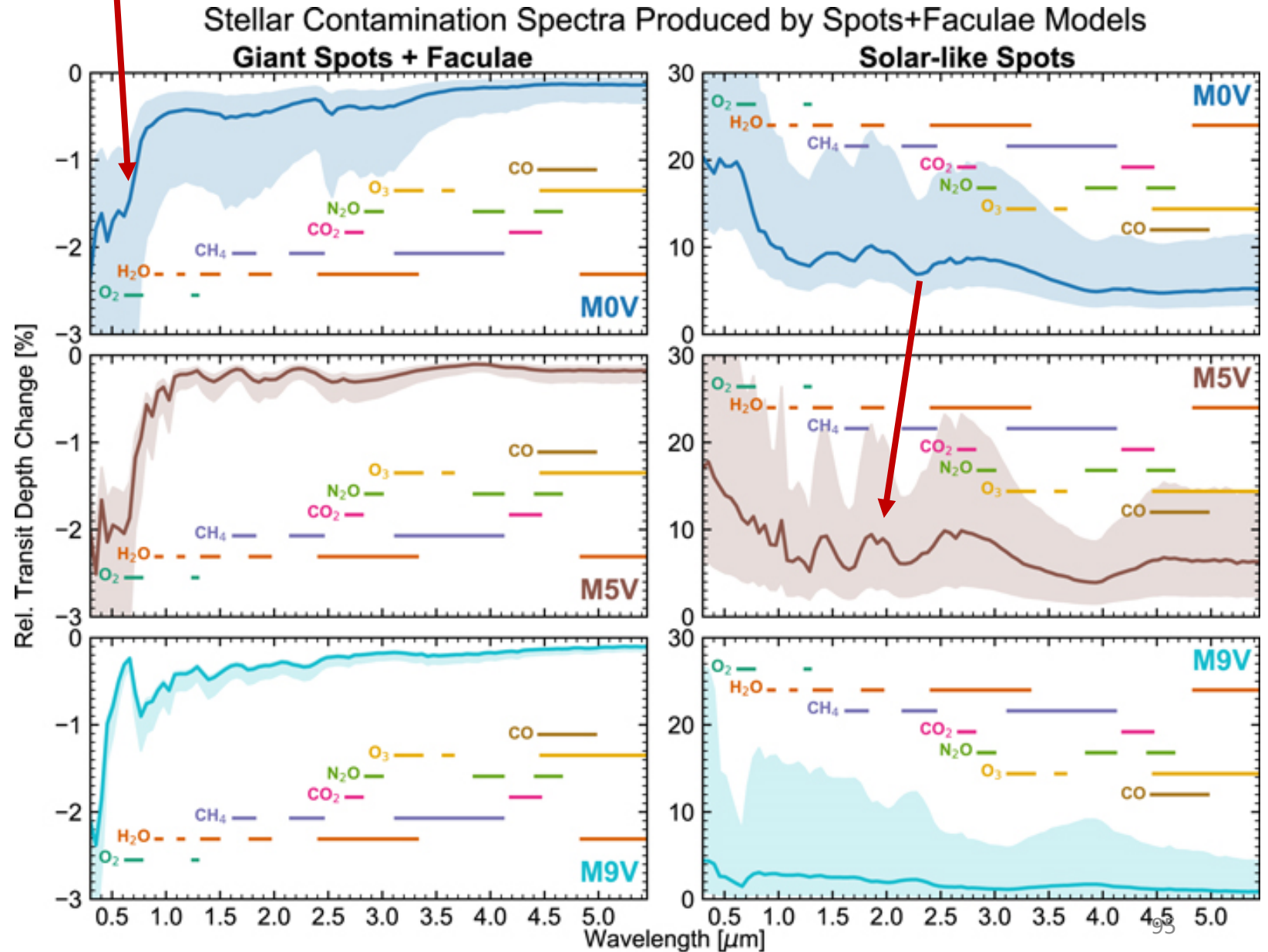
Rackham+18

Faculae not well constrain => large range of possibility expected  
For a given variability amplitude, adding faculae means larger fspot

Large faculae coverage => limit on the assumptions, and prevent masking crossing

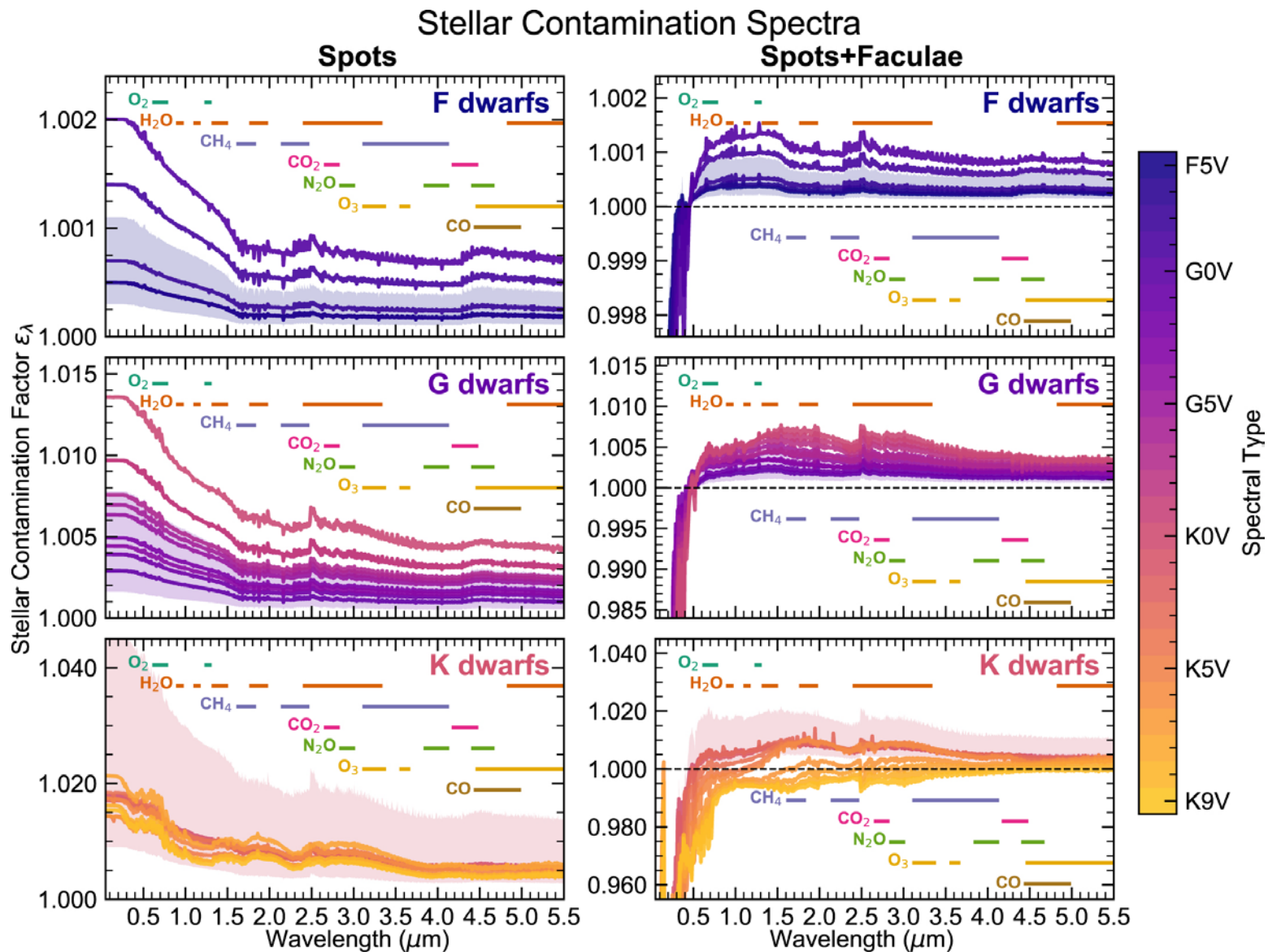
Can mask planetary signal

Can mimic planetary signal



# FGK stars

Rackham+19





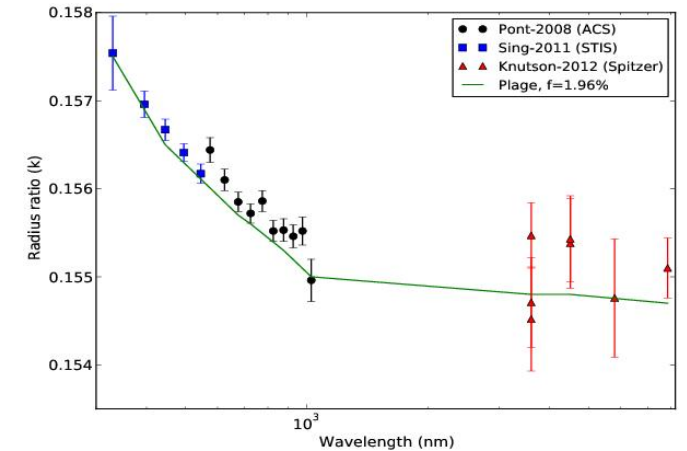
# Occultation

## Wavelength dependence of the contrast

- Can mimic broadband characteristics of planetary atmospheres
- Risk of interpreting slope versus  $\lambda$  as Rayleigh scattering

## Some difficulties

- More complicated if multiple transits (e.g., [Czesla et al. 2009](#); [Désert et al. 2011a](#); [Morris et al. 2017](#))
- Interplay with limb-darkening
- Faculae have low contrast => more difficult to extract from the noise
- Degeneracies spots/faculae
- Presence of multiple structures
- Many unknown properties (umbra/penumbra ratio for ex.)



Oshagh+14

# Mitigating solutions

Removing of affected points (occulted features) => not satisfactory

« Direct » correction of LCs (Sing+11, Berta+11)

- Warning: assume  $\max(\text{LC}) = \text{unspotted level}$  => wrong assumption

Use of out of transit spectra

Toward retrieval done simultaneously with spot/facula contribution = 3 additional parameters (filling factor,  $T_{\text{phot}}$ ,  $T_{\text{structures}}$ ) e.g. Pinhas+18, Bruno+20, Rathcke+21, Fournier-Tondreau+24, Thompson+24, ...

Combination of removing+Gpfit+detrending with activity indicators to remove flare signal (Lim+23)

See list of codes slide 57

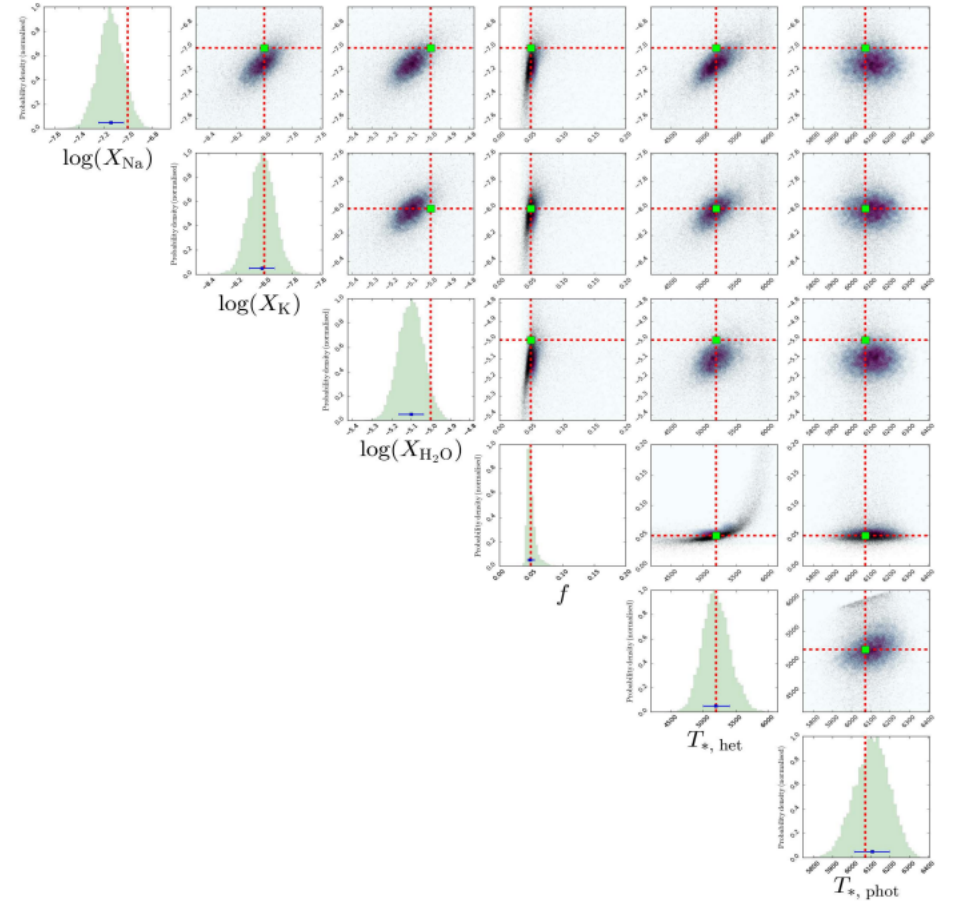
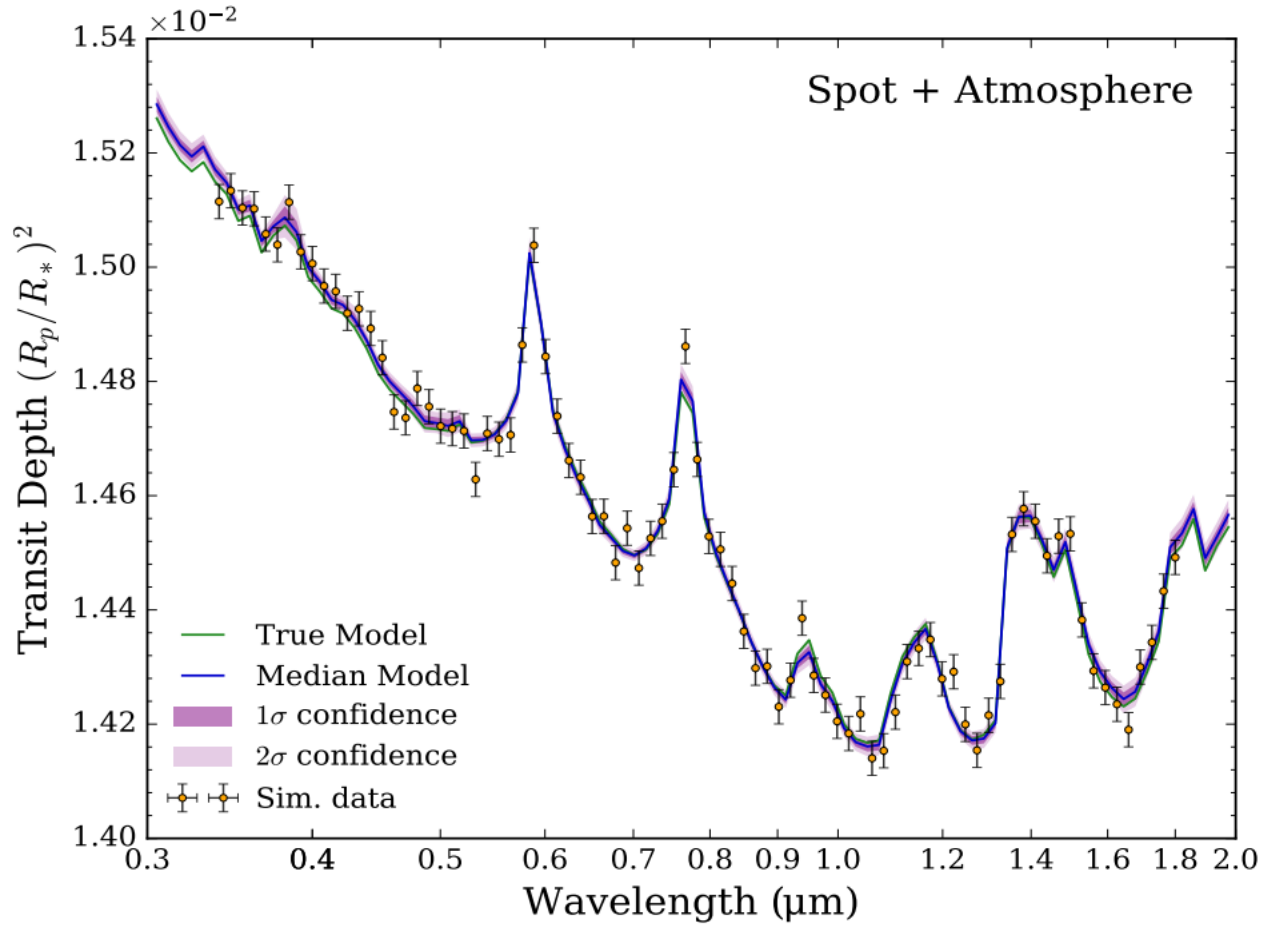
Limitations:

- strong degeneracies on the distribution of the features on the surface
- knowledge of stellar and spot/facula models

Rackham+18

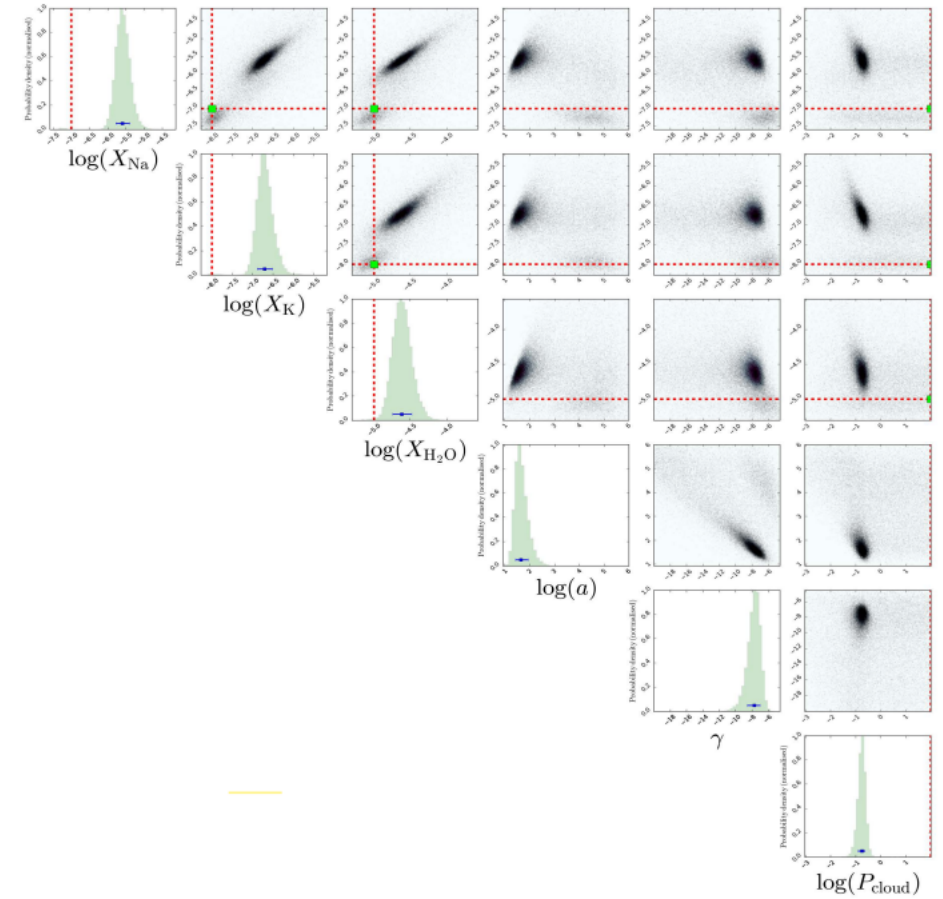
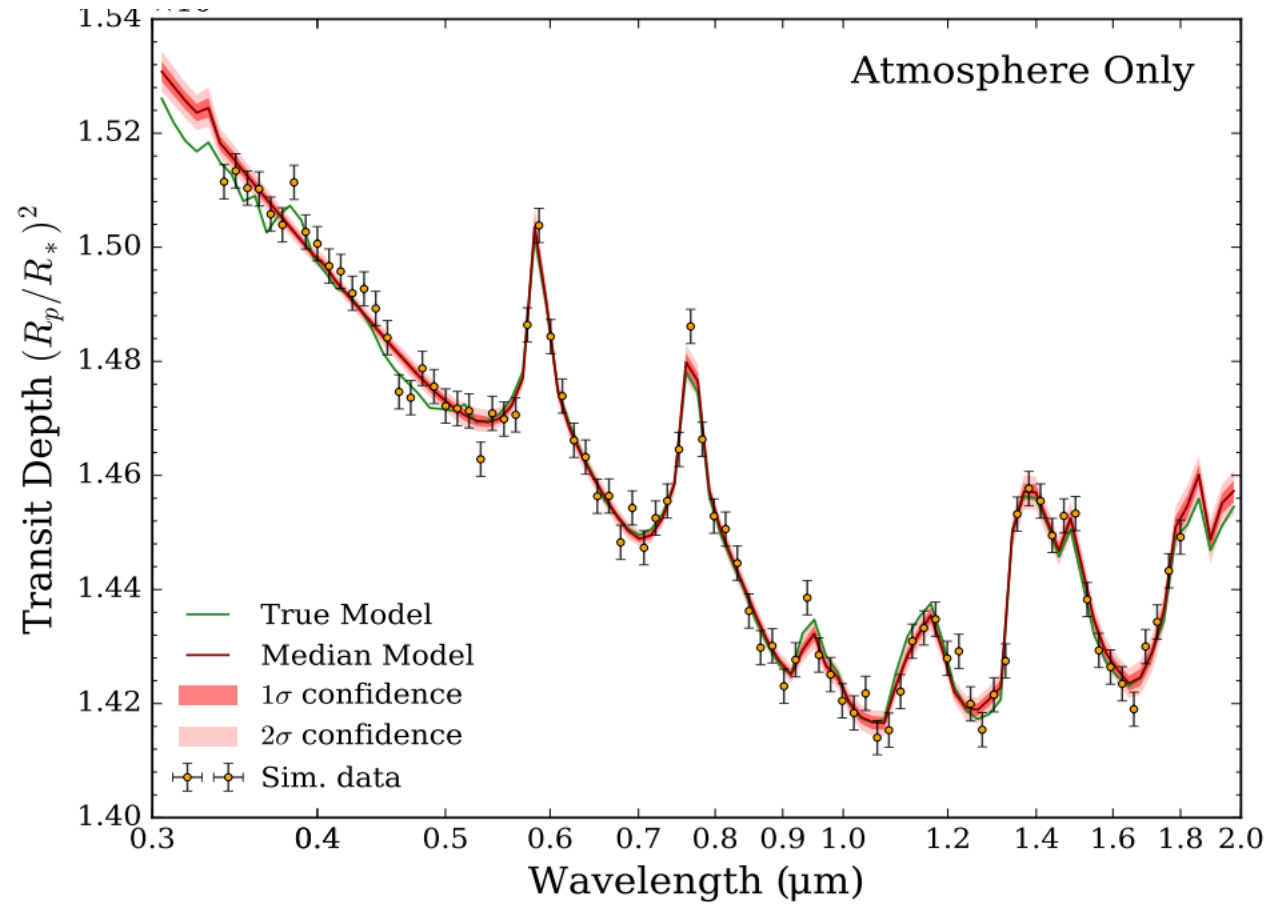
*Het=heterogeneous, spots and/or faculae*

Simulated data with spot ; fit with atmosphere+spot => good retrieval of the parameters



## Rackham+22

fit with atmosphere only => equally good fit, wrong parameters, add haze+cloud deck to compensate  
Biased on abundances by 3-5 sigma+spot (Na, K, H2O)

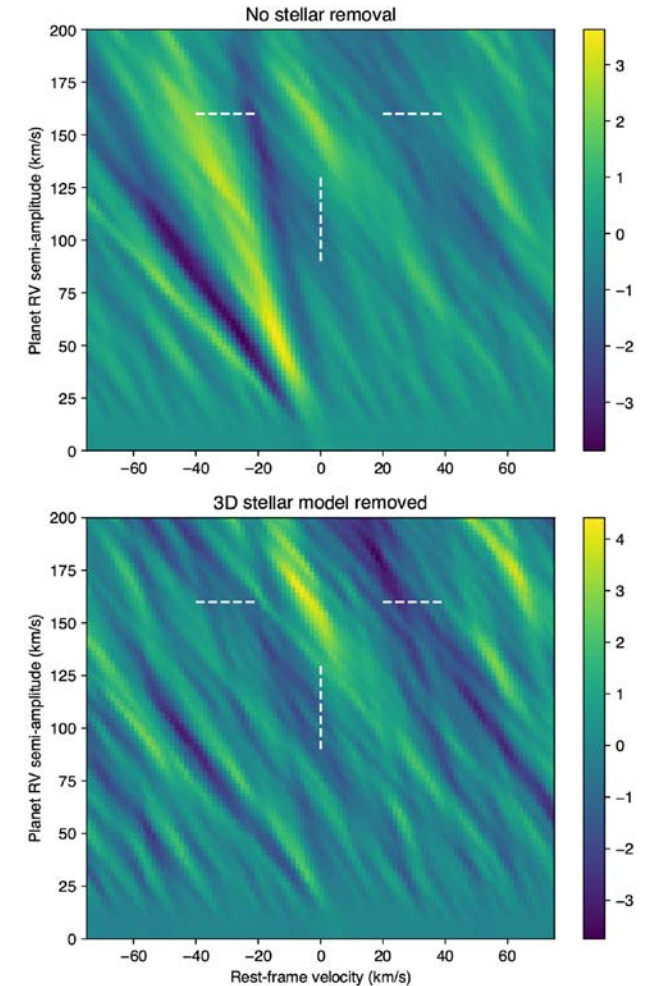


# Impact of granulation

High resolution spectra => resolved lines => cross-correlation techniques for transmission and emission spectroscopy

[Chiavassa&Brogi19](#)

- Use of 3D HD simulation of stellar granulation + IR transfer
- Temporally and averaged intensity realistic stellar spectrum (+ version to model changes during transit)
- Removal of the stellar spectrum
- => Improvement of the SNR on the detection
  
- See also [Maimone+22](#)



[Chiavassa&Brogi19](#)

HD189733b, CO detection

# Effect on high precision astrometry

To consider mostly for future missions (e.g. THEIA)

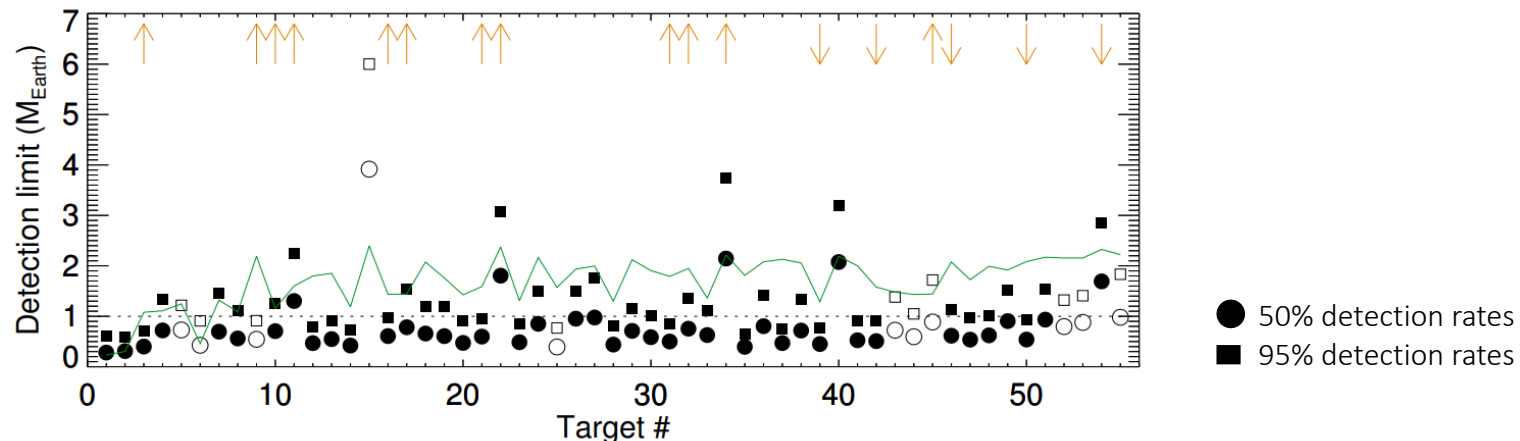
- Not a concern for very massive planets (Gaia)

Dominated by impact of spot and faculae contrasts

- Displacement of the photocenter

## Simulations

- Earlier works on a few spots only
- Solar case as a reference => [Makarov+10](#), [Lagrange+11](#)
- Recent extension to other stars, with realistic complex activity patterns: blind tests for large grid of parameters for stars@10pc ([Meunier&Lagrange 20](#)), new detection limits for the THEIA targets ([Meunier&Lagrange 22](#)) => **not problematic to detect Earth-like planet**



# Conclusion: a few messages

## Impact on RV

- Many complex processes, highly stochastic, always present, all time scales
- Strong diversity, poorly constrained => need better knowledge of the stellar physics for best use of a variety of activity indicators
- Usually sparse sampling in RV & bad phase coverage => need good coverage
- Superposed on other contributions: other planets - known or unknown, instrumental... (sophisticated methods need very good SNR)
- Still lot's to do => stellar physics, methods, control of the residuals

## Impact on photometry (transit, atmospheres)

- Link with RVs (PLATO follow-up)
- Warning about fine effects not often considered (granulation) for very low mass planets
- Strong augmentation of this issue in exoplanet atmosphere studies

## Impact on high precision astrometry

- Stellar physics not a limitation

# Simple spot simulations

- Desort+07

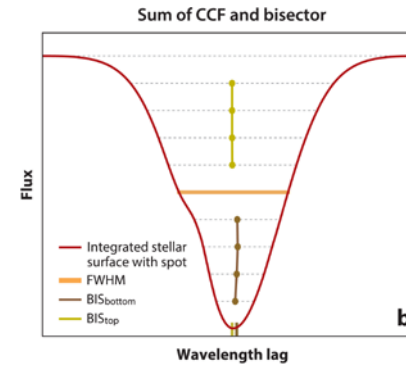
- BIS not changed if  $v \sin i <$  spectral resolution
- Regimes where RV significant, BIS not significant
- Scaling laws depends on instrument & spectral type
- Strong impact of latitude and inclination
- Possibility to use chromatic effects

- Boisse+12

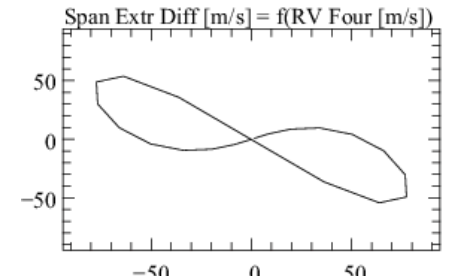
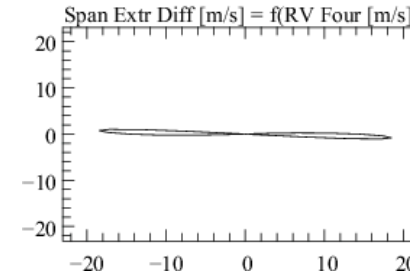
- Similar conclusions /Desort+07 ( $v \sin i$ , ff)
- + impact latitude, center-to-limb darkening
- Comparison with observations

- Dumusque+14

- Addition plages & convective blueshift inhibition, more realistic limb-darkening
- Impact of spectral resolution
- Use of spot and quiet Sun spectra as inputs

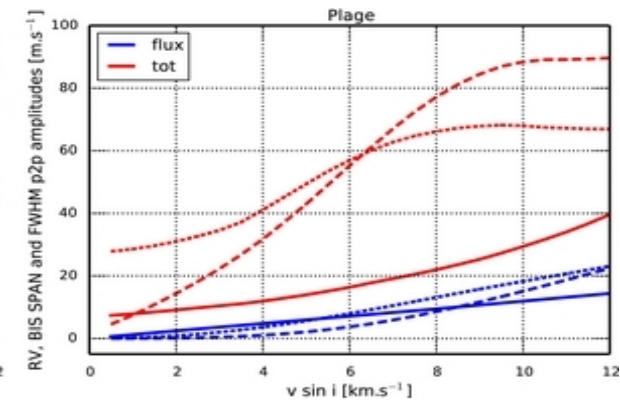
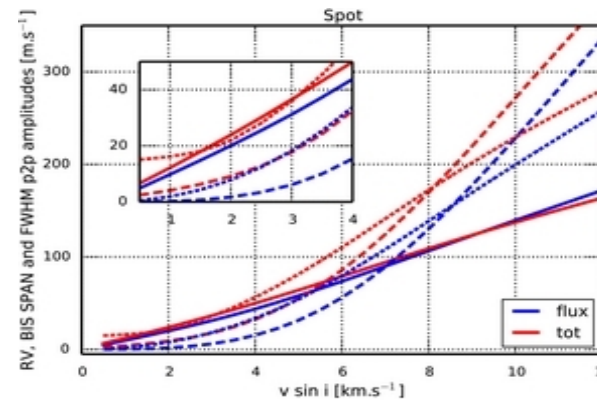


Hara&Ford23



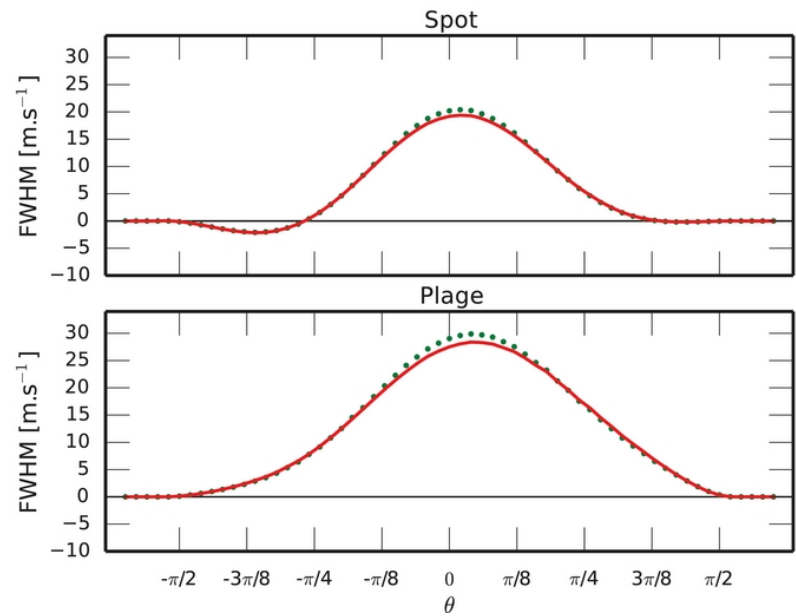
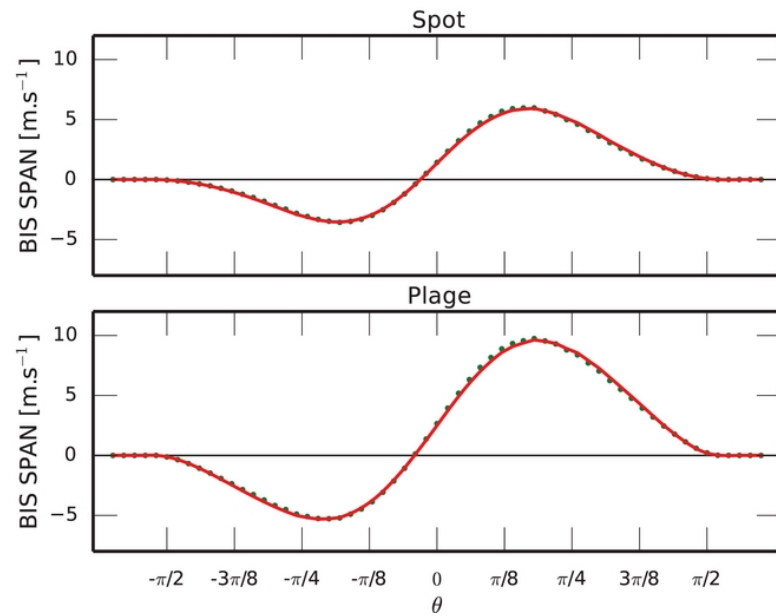
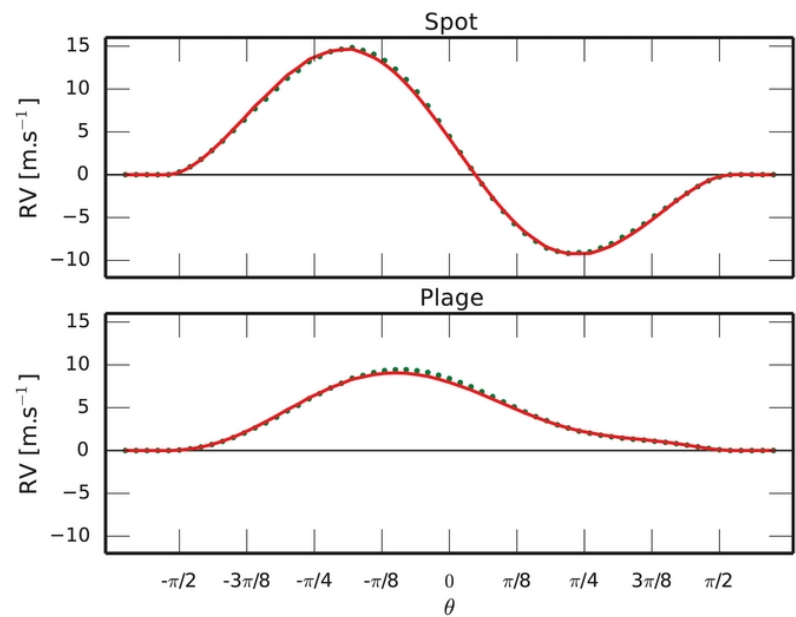
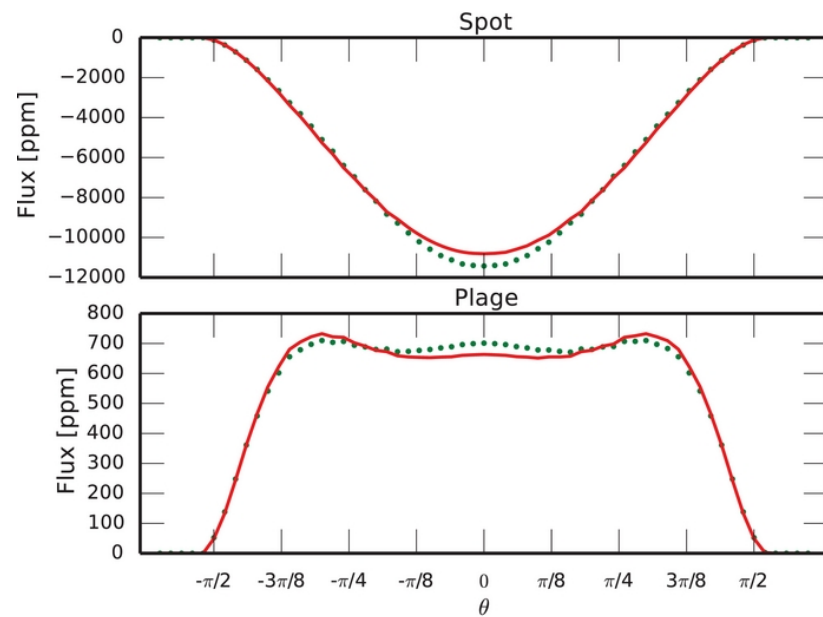
$v \sin i = 2 \text{ \& } 7 \text{ km/s}$

Desort+07



Dumusque+14





Dumusque+14

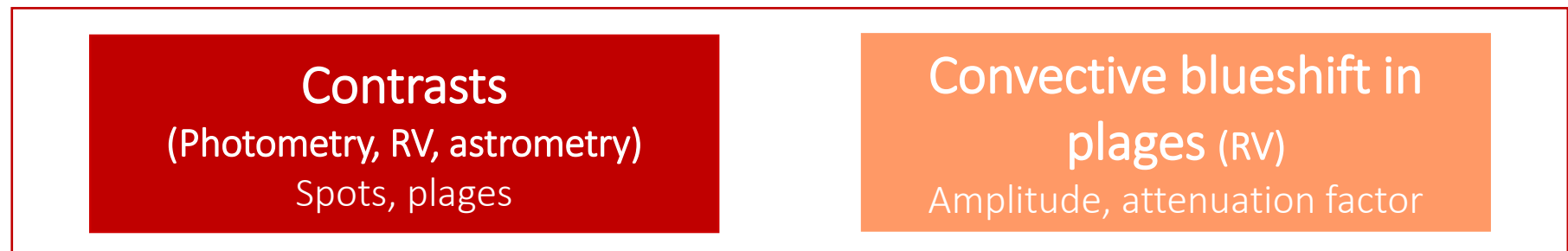
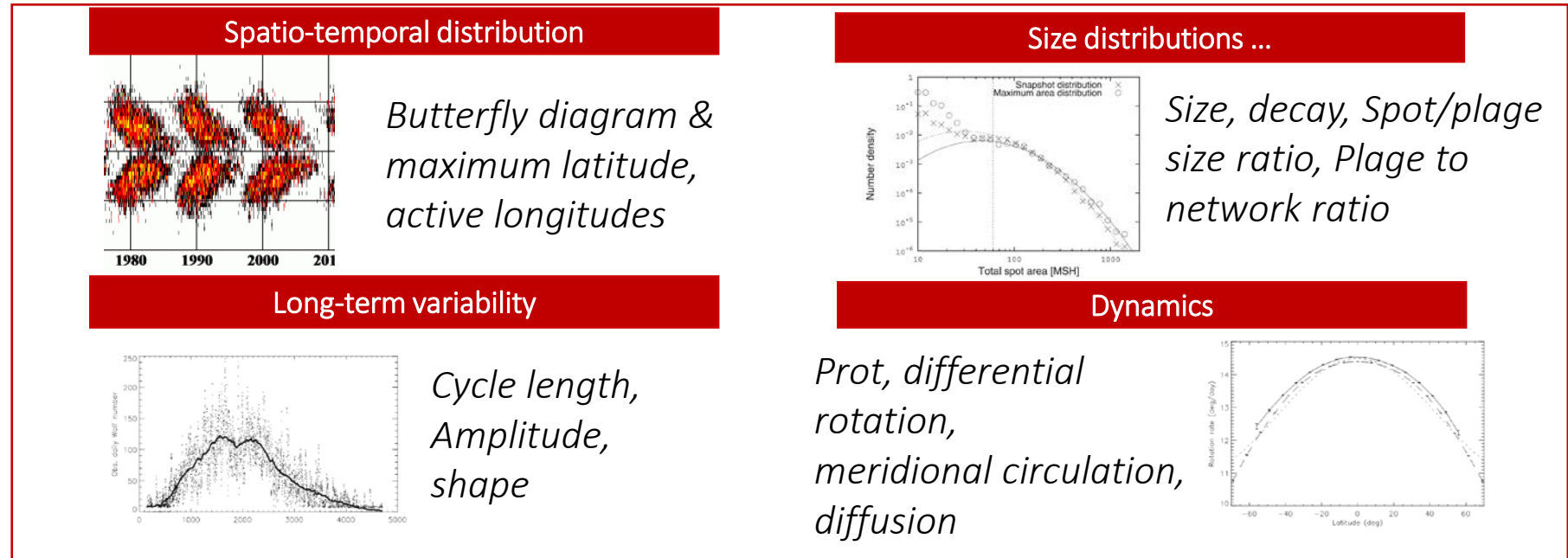
# Simulation parameters from empirical laws

List of structures vs.  $t$

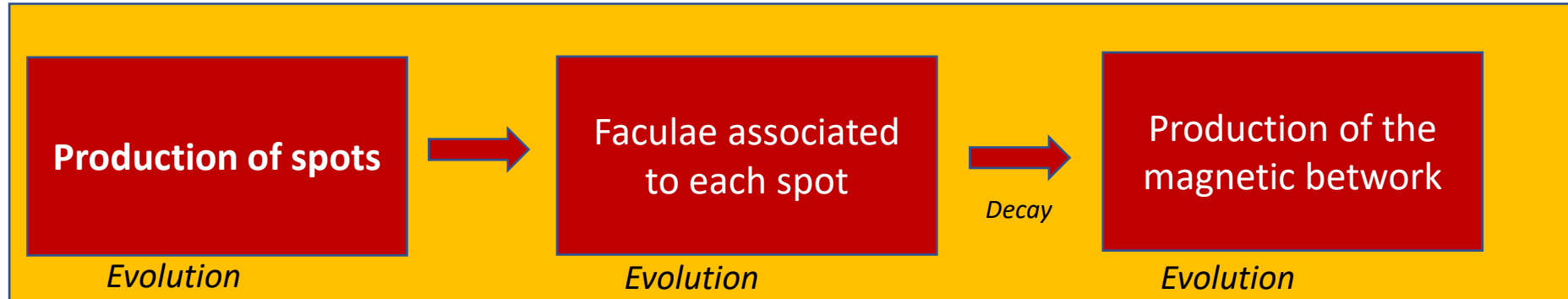
Consistent description  
*spots+plages+network*

Time series

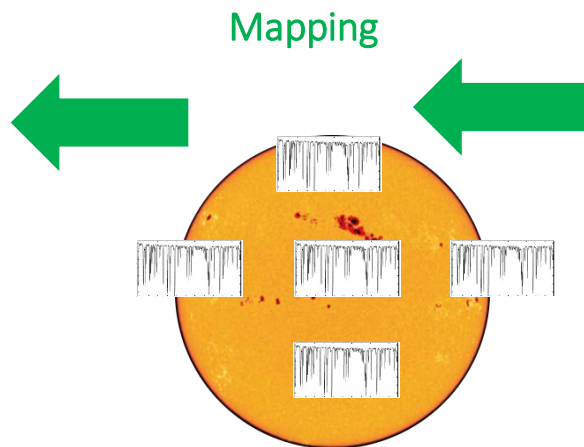
RV, Photometry,  
Astrometry,  
 $\text{LogR}'_{\text{HK}}$



# Simulations structures → RV, photometry



**Version 2 (pixels/map)**  
Filling factor, spectra (=>RV and indicators), photometry, astrometry



**List of structures**  
(date, latitude, longitude, size)

**Version 1 (analytical) :**  
Filling factor, RV, photometry, astrometry, logR'HK

Ex. Borgniet+15, Meunier+19

# Fitting challenge : Dumusque+16,17

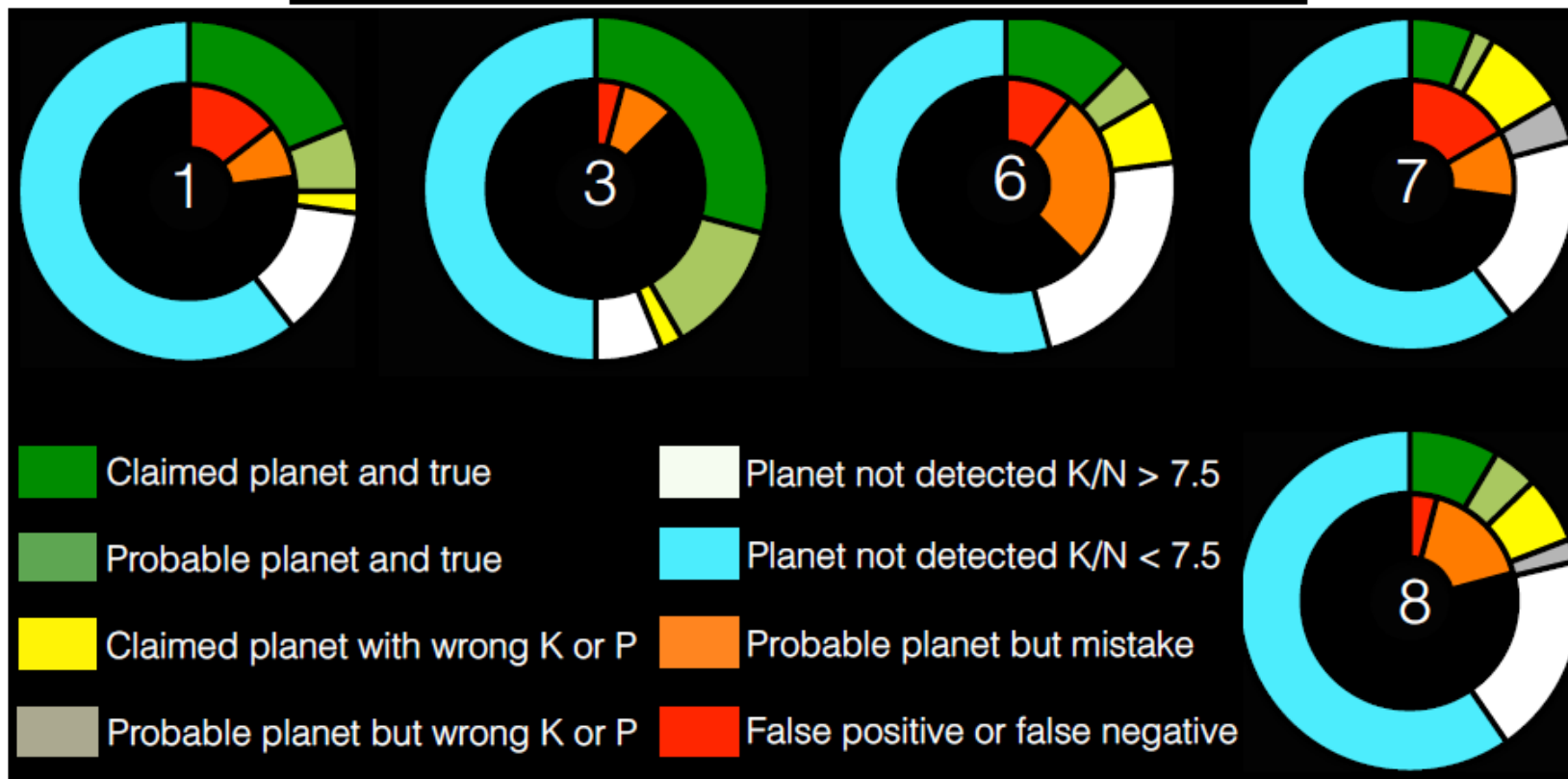
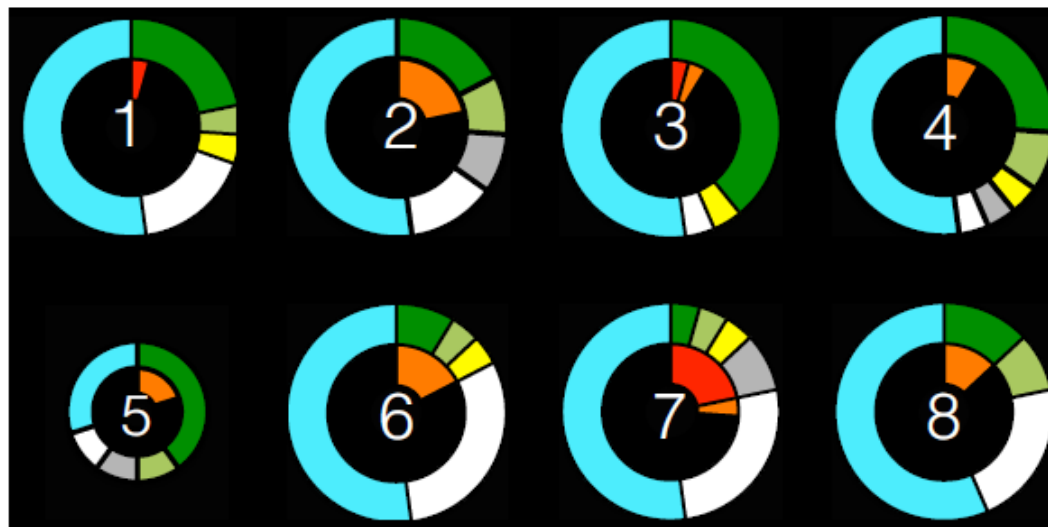
- Use of complex synthetic time series
- Add planet (or not)
- Blind test → analysis by 8 teams
- Focus on exoplanet detectability

**Table 2.** Recovery rate of planetary signals detected (dark green, light green, yellow and gray color flags), of publishable planets with correct orbital parameters (dark green and yellow color flags) and of false positives and false negatives (red color flag) for each team.

	Bayesian framework + red-noise models					Other techniques		
	1: Torino	2: Oxford	3: Tuomi	4: Gregory	5: Geneva	6: Hatzes	7: Brera	8: IMCCE
Detected planetary signals $K/N > 7.5$								
5 first systems (total 10)	80% (8)	70% (7)	90% (9)	90% (9)	83% (5/6)	30% (3)	40% (4)	50% (5)
all systems (total 18)	68% (12)	–	83% (15)	–	–	39% (7)	50% (9)	50% (9)
Publishable planetary signals $K/N > 7.5$								
5 first systems (total 10)	50% (5)	40% (4)	90% (9)	70% (7)	67% (4/6)	20% (2)	20% (2)	30% (3)
all systems (total 18)	50% (9)	–	61% (11)	–	–	28% (5)	39% (7)	39% (7)
Detected planetary signals $K/N \leq 7.5$								
5 first systems (total 13)	8% (1)	8% (1)	8% (1)	8% (1)	25% (1/4)	8% (1)	15% (2)	0%
all systems (total 30)	3% (1)	–	20% (6)	–	–	13% (4)	7% (2)	3% (1)
Publishable planetary signals $K/N \leq 7.5$								
5 first systems (total 13)	0%	0%	8% (1)	0%	0%	8% (1)	8% (1)	0%
all systems (total 30)	3% (1)	–	13% (4)	–	–	13% (4)	3% (1)	0%

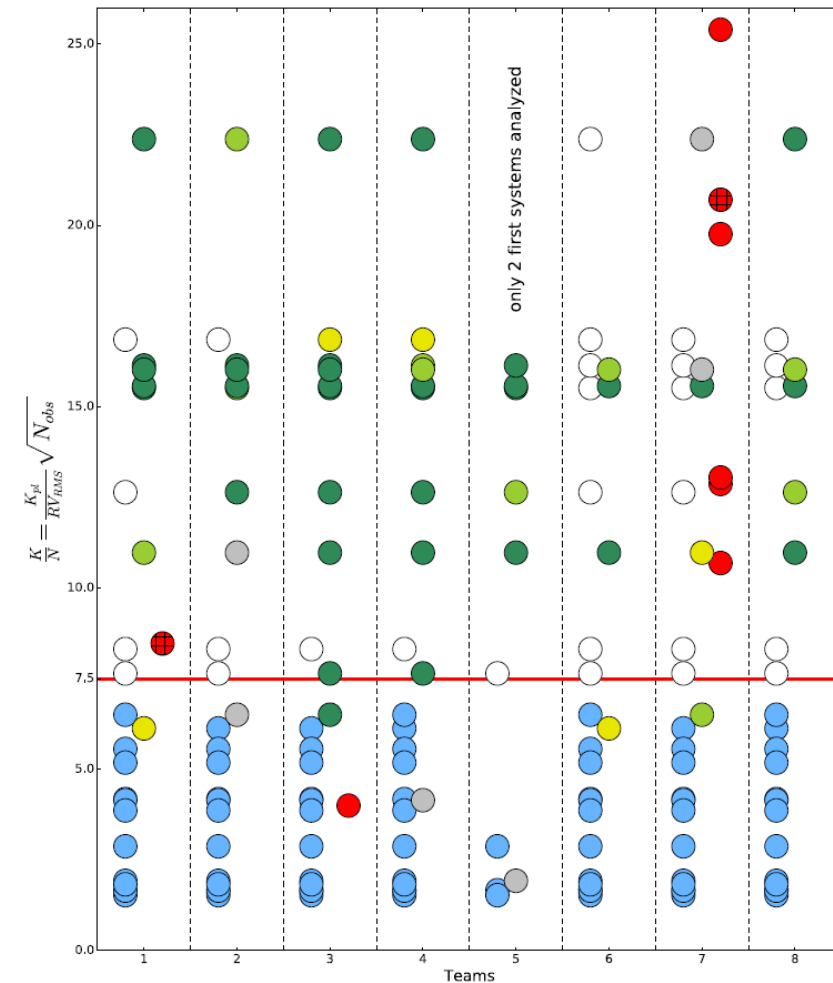
**Notes.** Recovery rates between 0 and 33, 33 and 66, and 66 and 100% are highlighted in red, yellow and green, respectively.

Dumusque+17



# Fitting challenge : Dumusque+16,17

- Use of complex synthetic time series
- Add planet (or not), several time series
- Blind test → analysis by 8 teams
- Focus on exoplanet detectability
- GPs performed best
- Criterion  $C = K_{\text{pl}} \times \sqrt{N_{\text{obs}}} / \text{RVjitter}$



# Large-scale RV blind tests

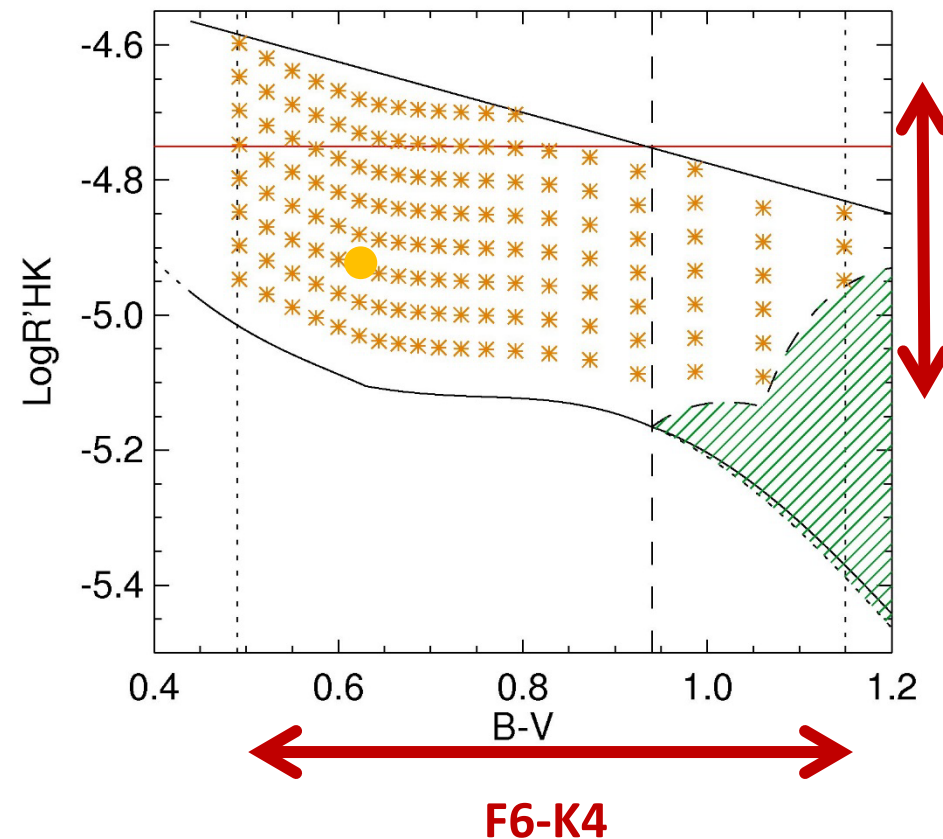
## Based on

- Very good knowledge of the Sun
- Scaling based on stellar observations and simulations

## Large sets of realistic synthetic time series

- Complex solar-like activity patterns, structure evolution
- All time scales
- **All processes (except meridional circulation)**
- Covering range in spectral types & activity levels
- >11000 synthetic time series x 10 inclinations
- Production of  $\log R'_{\text{HK}}$ , photometry & astrometry

Show the importance of blind tests + need to improve mitigation techniques



Based on published laws  
Details in Meunier+ 19

# Two types of blind tests

## Set-up

- Planet-free synthetic stellar RV time series + photon noise + **planet**
- Temporal sampling
- Model to correct for stellar activity (non-linear function of  $\log R'_{\text{HK}}$  and cycle phase [Meunier+19](#)) → RV only

10 year time series  
1000 nights  
4 month gap / year  
1h average  
HARPS-like / VIS

Follow-up of a transit detection

Mass estimation  
Uncertainty

Search for planets

Good detection rates  
Wrong detection rates  
False positive rates