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## Gaia Data Release 3

### Stellar chromospheric activity and mass accretion from Ca II IRT observed by the Radial Velocity Spectrometer

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#### ABSTRACT

**Context.** The *Gaia* Radial Velocity Spectrometer (RVS) provides the unique opportunity of a spectroscopic analysis of millions of stars at medium-resolution ( $\lambda/\Delta\lambda \sim 11500$ ) in the near-infrared (845 – 872 nm). This wavelength range includes the Ca II infrared triplet (IRT) at 850.03, 854.44, and 866.45 nm, which is a good diagnostics of magnetic activity in the chromosphere of late-type stars.

**Aims.** Here we present the method devised for inferring the *Gaia* stellar activity index from the analysis of the Ca II IRT in the RVS spectrum, together with its scientific validation.

**Methods.** The *Gaia* stellar activity index is derived from the Ca II IRT excess equivalent width with respect to a reference spectrum, taking the projected rotational velocity ( $v \sin i$ ) into account. Scientific validation of the *Gaia* stellar activity index is performed by deriving a  $R'_{\text{IRT}}$  index, largely independent of the photospheric parameters, and considering the correlation with the  $R'_{\text{HK}}$  index for a sample of stars. A sample of well studied PMS stars is considered to identify the regime in which the *Gaia* stellar activity index may be affected by mass accretion. The position of these stars in the colour-magnitude diagram and the correlation with the amplitude of the photometric rotational modulation is also scrutinised.

**Results.** *Gaia* DR3 contains a stellar activity index derived from the Ca II IRT for some  $2 \times 10^6$  stars in the Galaxy. This represents a gold mine for studies on stellar magnetic activity and mass accretion in the solar vicinity. Three regimes of the chromospheric stellar activity are identified, confirming suggestions made by previous authors on much smaller  $R'_{\text{HK}}$  datasets. The highest stellar activity regime is associated with PMS stars and RS CVn systems, in which activity is enhanced by tidal interaction. Some evidence of a bimodal distribution in MS stars with  $T_{\text{eff}} \geq 5000$  K is also found, which defines the two other regimes, without a clear gap in between. Stars with  $3500 \text{ K} \lesssim T_{\text{eff}} \lesssim 5000 \text{ K}$  are found to be either very active PMS stars or active MS stars with a unimodal distribution in chromospheric activity. A dramatic change in the activity distribution is found for  $T_{\text{eff}} \lesssim 3500 \text{ K}$ , with a dominance of low activity stars close to the transition between partially- and fully-convective stars and a rise in activity down into the fully-convective regime.

**Key words.** Stars: activity – Stars: chromospheres – Stars: late-type – Stars: pre-main sequence – Methods: data analysis – Catalogs

## 1. Introduction

A stellar chromosphere is the manifestation of non-radiative heating due to (magneto)acoustic waves dissipation and magnetic-field recombination in late-type stellar atmosphere (see Linsky 2017; Carlsson et al. 2019, for recent reviews). Such a non-radiative heating becomes increasingly important in the energy balance at increasing heights (decreasing gas density) above the stellar photosphere, and leads to a temperature increase above the radiative equilibrium value, as revealed by vari-

able emission in X-rays, UV, radio, and in some optical spectral lines like the Ca II H&K doublet, the H $\alpha$  and the Ca II infrared triplet (IRT) at  $\lambda$  850.03, 854.44, and 866.45 nm (vacuum). A large fraction of the stellar non-radiative energy is dissipated in the chromosphere while the remaining is transferred to the outer atmosphere producing a variety of phenomena including the heating of the corona and the stellar wind.

The magnetic fields in the stellar outer atmosphere of late-type stars emerge from the stellar interior where they are generated by a complex dynamo mechanisms involving turbulence

and rotation. The angular momentum loss via the magnetised wind causes the star to spin-down, so that the dynamo efficiency decreases in time. As a consequence, many phenomena connected to the surface magnetic field decay as the star ages. These include surface rotation, photospheric spots, chromospheric and coronal emission, as well as flares occurrence and energy. The time decay of rotation and chromospheric activity in the early main sequence, in particular, are quite predictable and can be used as stellar clocks (see, e.g. Lanzafame & Spada 2015; Mamajek & Hillenbrand 2008, and references therein). On the other hand, young, fast-rotating stars are in a “saturated” regime in which the correlation of magnetic activity with rotation is weak and our knowledge of the rotation evolution itself is still poor, which prevents using phenomena related to magnetic activity as stellar clocks in this regime (see, e.g., Lanzafame et al. 2019, and references therein). For main sequence stars older than the Sun, the comparison with asteroseismology has spurred some controversy on the reliability of gyrochronology (Barnes 2003, 2010; Lanzafame & Spada 2015; Spada & Lanzafame 2020) at low rotation rates, where wind-braking seems to become ineffective (van Saders et al. 2016). However, the method hinges on the knowledge of the metallicity (Amard et al. 2020), which is becoming available on a large scale only with recent spectroscopic surveys. Note also that chromospheric activity is superimposed on a basal emission originating from the dissipation of acoustic energy (Schrijver et al. 1989), and that an investigation on the lowest level of chromospheric activity may help in understanding the general role of purely acoustic energy in the stellar chromosphere energy balance.

In pre-main sequence stars still accreting mass through the protostellar disk, emission induced by accretion shocks and magnetosphere is superimposed to the chromospheric emission, sometimes dominating completely over the chromospheric component (see, e.g., Hartmann et al. 2016; Linsky 2017). Large surveys permit to establish empirically “dividing lines” between the regimes dominated by chromospheric activity or accretion (e.g. Lanzafame et al. 2015; Žerjal et al. 2017).

Stellar magnetic activity plays a crucial role in the search of exoplanets, particularly of Earth-like planets. The presence of spots, convective turbulence, and granulation induces a radial velocity (RV) “jitter” that may sometimes mimic the signal produced by the planets or hinder the signal produced by small planets. For Sun-like stars, measurements of chromospheric emission in the Ca II H&K lines, such as  $R'_{\text{HK}}$  (Noyes et al. 1984; Duncan et al. 1991) have been shown to correlate with intrinsic stellar RV variations (Campbell et al. 1988; Saar et al. 1998; Santos et al. 2000; Wright 2005). In these cases, the chromospheric magnetic activity is also correlated with the presence of photospheric spots or faculae, so that it turns out to be a useful proxy of the processes that produce the intrinsic RV jitter. In the general case, the dependence on other stellar parameters has to be taken into account too, particularly the dependence on  $\log g$  (Bastien et al. 2014) and therefore on the evolutionary stage of the star (see also Luhn et al. 2020, and references therein). Therefore, measurements of the chromospheric magnetic activity, together with the fundamental stellar parameters, provide an efficient tool for understanding which type of stars presents poor cases for RV follow-up for planet hunting due to high jitter induced by magnetic activity.

Stellar magnetic activity phenomena include the atmospheric space weather, i.e. the perturbation traveling from stars to planets in the form of flares, winds, coronal mass ejections and energetic particles. These phenomena may profoundly affect the dynamics, chemistry, and climate of exoplanets (see, e.g., Airapetian

et al. 2020, and references therein), and, in some cases, even the retention of the exoplanetary atmosphere itself (e.g. Guilluy et al. 2020).

Magnetic activity has also an impact in the derivation of accurate elemental abundance in the stellar atmosphere. Lines formed up in the photosphere are found to modulate over the stellar activity cycle (Flores et al. 2016; Yana Galarza et al. 2019). Analysing HARPS high resolution spectra of 211 sunlike stars observed at different phases of their activity cycle, Spina et al. (2020) observed an increase in the equivalent width of the lines as a function of the activity index  $R'_{\text{HK}}$  (see Appendix A). This effect is visible for stars with  $\log R'_{\text{HK}} \geq -5.0$ , increases with increasing activity, and produces an artificial growth of the stellar microturbulence and a decrease in effective temperature and metallicity.

As part of the activities carried out by the Coordination Unit 8 (CU8) of the Gaia Data Processing and Analysis Consortium (DPAC), we have implemented a method for deriving a stellar activity index using the Ca II IRT lines observed by the *Gaia* Radial Velocity Spectrometer (RVS). The method is part of the Extended Stellar Parametrizer for Cool Stars, (ESP-CS) module of the Astrophysical parameters inference system (Apsis) (Bailer-Jones et al. 2013; Creevey 2022; Fouesneau 2022; Gaia Collaboration 2022). In this paper we present this method together with the scientific validation of the results available in Gaia DR3. The scientific validation, in particular, provides criteria for discriminating between the purely chromospheric activity regime and the mass accretion regime in T Tauri stars. In Sect. 2 we describe the method implemented, in Sect. 3 we give an outline of the results obtained together with the scientific validation of the data available in Gaia DR3, and in Sect. 4 we draw our conclusions.

## 2. Method

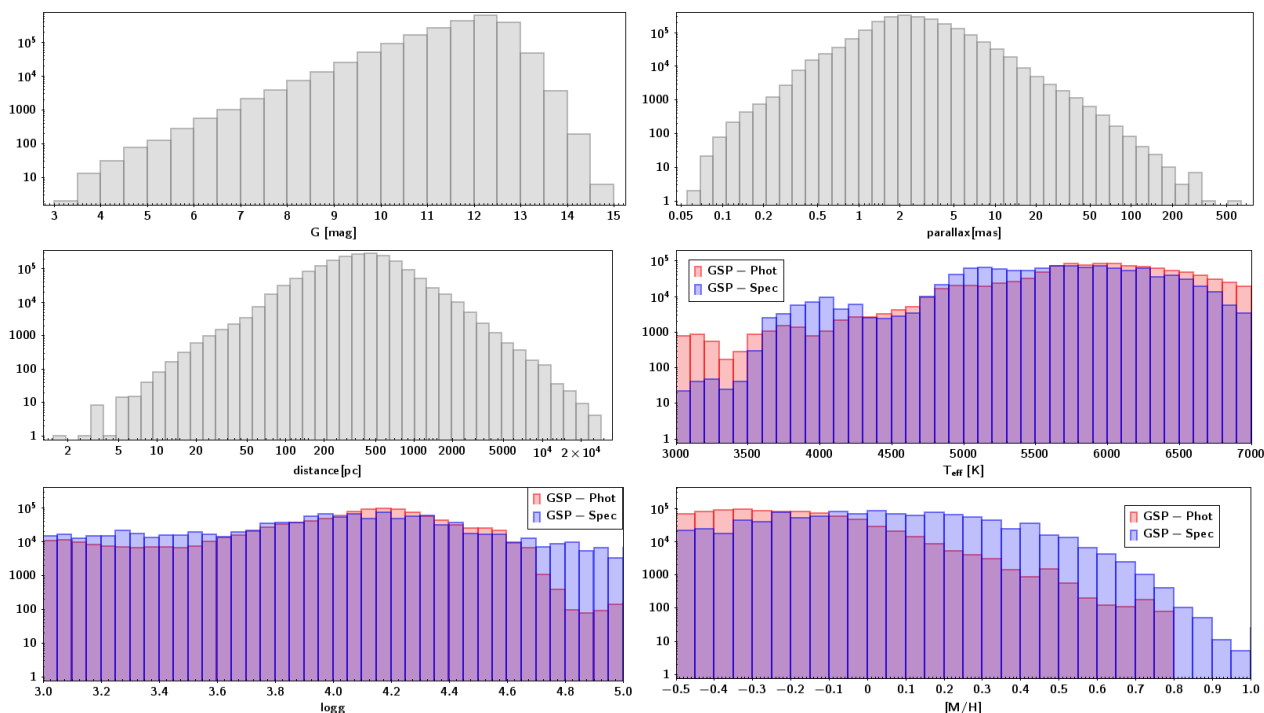
### 2.1. Input data

The Apsis ESP-CS module takes the RVS average continuum normalised spectra in the stellar rest-frame as input (see Gaia Collaboration 2022; Creevey 2022, for details on the Apsis input data). In order to set up a template spectrum representative of the inactive photosphere, knowledge of the stellar fundamental parameters ( $T_{\text{eff}}$ ,  $\log g$ , [M/H]) is required (see Sect. 2.2). These parameters are taken from the output of either the General Stellar Parametrizer from Spectroscopy GSP-Spec module (Recio-Blanco 2022) or the General Stellar Parametrizer from Photometry GSP-Phot module (Andrae 2022; Liu et al. 2012; Bailer-Jones 2011). During the processing, the default value is to use the parameters from GSP-Spec because the activity index is derived from the same data, but when they are not available, the ones from GSP-Phot are used. The projected rotational velocity,  $v_{\text{broad}}$ , provided by CU6 is also used when available (see Sect. 2.2). Filtering of the input data is described in Gaia Collaboration (2022).

In Fig. 1 we show the distribution in apparent  $G$  magnitude, parallax ( $\varpi$ ), distance (as derived by GSP-Phot Andrae 2022),  $T_{\text{eff}}$ ,  $\log g$ , and [M/H] for the sources for which the activity index has been derived.

### 2.2. Reference inactive spectrum

We adopt a purely photospheric theoretical spectrum as reference inactive spectrum. The motivations and limitations of this choice are discussed extensively in Appendix A. Here we outline



**Fig. 1.** Distribution in  $G$ ,  $\varpi$ , distance (as derived by GSP-Phot Andrae 2022),  $T_{\text{eff}}$ ,  $\log g$ , and  $[M/H]$  for the sources for which the activity index has been derived.

that this is a practical and robust assumption that allows us to put stars on a relative and homogeneous activity scale.

The purely photospheric theoretical spectrum is obtained by a linear interpolation over a grid of MARCS synthetic spectra at the stellar parameters ( $T_{\text{eff}}$ ,  $\log g$ ,  $[M/H]$ ) as determined by GSP-Spec or GSP-Phot (Sect. 2.1). Linear interpolation is preferred to more elaborate spectrum representations because of the low computational cost combined with a reproduction of the observed spectrum which is satisfactory for our purposes (see, e.g., Figs. 2 and 5). The synthetic spectra are computed under the assumption of local thermodynamic equilibrium (LTE) and radiative equilibrium (RE). As discussed in Appendix A, deviations from the LTE approximation are expected to be small in the range of parameters explored and not critical for our purposes. Also the assumption of RE does not pose critical issues in putting stars on a relative activity scale, despite the fact that the upper photosphere is not expected to be strictly in radiative equilibrium even in the most inactive stars.

After interpolation, the reference spectrum is rotationally broadened at the projected rotational velocity  $v \sin i$  derived by the CU6 analysis (parameter `vbroad`).

The interpolated rotationally broadened synthetic spectrum is taken as reference (or template) inactive spectrum.

### 2.3. Activity index

The activity index is derived by comparing the observed RVS spectrum with the radiative equilibrium model spectrum computed as described in the previous section.

An excess equivalent width factor in the core of the Ca II IRT lines, computed on the observed-to-template ratio spectrum, is taken as an index of the stellar chromospheric activity or, in more extreme cases, of the mass accretion rate in pre-main sequence stars (see Appendix B).

Given the template spectrum, the observed spectrum is first re-normalised by multiplying it by a third order Chebyshev polynomial, whose coefficients are determined by minimising the pixel-to-pixel average deviation. Then the observed-to-template ratio spectrum is calculated on a common wavelength grid at the stellar rest frame. The ratio spectrum is integrated on a  $\pm\Delta\lambda = 0.15\text{nm}$  interval around the core of each of the triplet lines and the mean of the 3 values obtained is taken as activity index. Formally, the activity index ( $\alpha$ , parameter `activityindex_espcs` in nm units in the *Gaia* DR3 catalog) is defined as

$$\alpha \equiv \int_{-\Delta\lambda}^{+\Delta\lambda} \left( \frac{r_{\lambda}^{\text{obs}}}{r_{\lambda}^{\text{templ}}} - 1 \right) d\lambda, \quad (1)$$

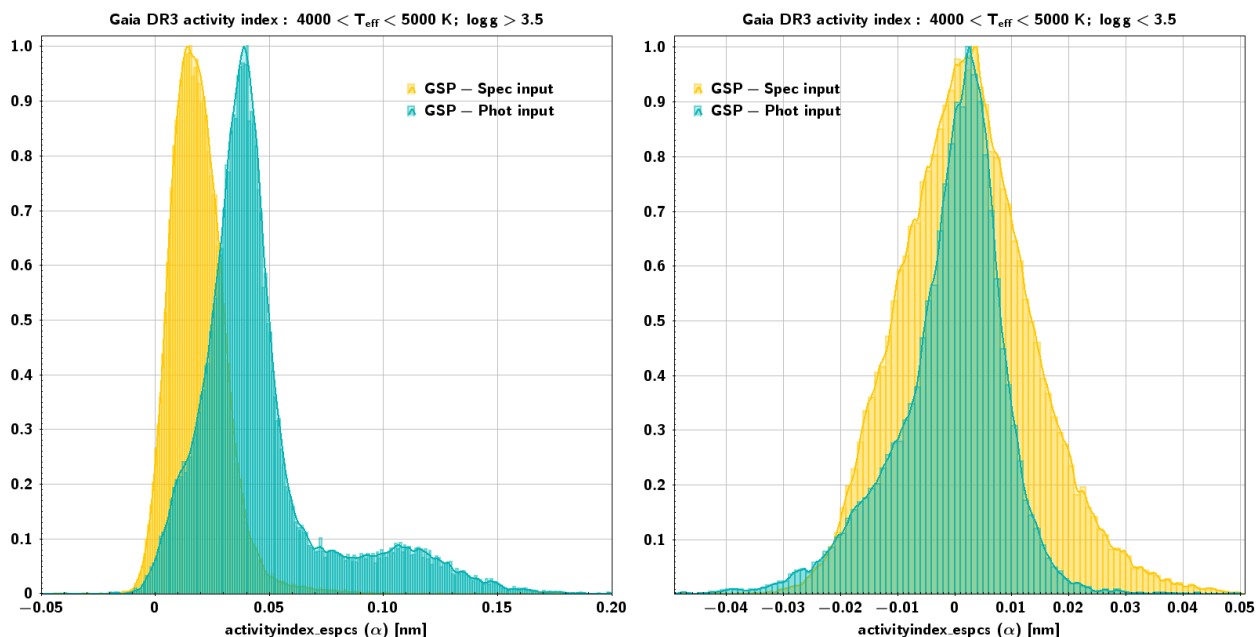
where  $r_{\lambda}^{\text{obs}}$  and  $r_{\lambda}^{\text{templ}}$  are the observed and the template spectrum, respectively, normalised to the continuum,

$$r_{\lambda} \equiv \frac{f_{\lambda}}{f_{\lambda}^c}. \quad (2)$$

Uncertainties (parameter `activityindex_espcs_uncertainty` in nm units in the *Gaia* DR3 catalog) are evaluated by propagating the pixel standard error, ignoring theoretical uncertainties.

The parameter  $\alpha$  is close to zero for inactive stars and positive for active stars, values above  $\approx 0.03$ – $0.05$  nm indicating a possible contribution to the line flux due to mass accretion processes (Sect. 3.4) or enhanced activity in close binaries due to tidal interaction. Small negative values may derive from uncertainties in the input parameters or be physically plausible for low level of chromospheric activity (see Appendix A).

The activity index  $\alpha$  defined in Eq. (1) is suitable for comparing activity in stars with similar fundamental parameters ( $T_{\text{eff}}$ ,  $\log g$ ,  $[M/H]$ ), but unsuitable for the comparison in stars with significantly different fundamental parameters, especially those



**Fig. 2.** Activity index histogram (bin size 0.001 nm, with KDE superimposed) normalised to peak values of stars with  $T_{\text{eff}} \in (4000 \text{ K}, 5000 \text{ K})$ . The left panel includes stars with  $\log g > 4.0$  (dwarfs) and the right panel stars with  $\log g \in (3.0, 3.5)$ . From this latter we estimate an upper limit to the true dispersion of the sample of 0.011 nm and 0.006 nm for the GSP-Spec and GSP-Phot input respectively, and an upper limit to the true bias of  $\approx 0.002$  nm (see text for details).

with different  $T_{\text{eff}}$ . In fact, a given value of  $\alpha$  corresponds to significantly different values of the chromospheric flux contribution when the underlying continuum flux is significantly different. In order to overcome the difficulties posed by this “contrast” effect, an index  $R'_{\text{IRT}}$  conceptually similar to  $R'_{\text{HK}}$  can be derived from  $\alpha$  and the stellar parameters. First, note that  $\alpha$  is related to the excess equivalent width

$$\Delta W \equiv \int_{-\Delta\lambda}^{+\Delta\lambda} (r_{\lambda}^{\text{obs}} - r_{\lambda}^{\text{templ}}) d\lambda, \quad (3)$$

by the relation:

$$\Delta W \simeq \langle r_{\lambda} \rangle_{\text{core}} \alpha \quad (4)$$

where  $\langle r_{\lambda} \rangle_{\text{core}}$  is the expected line-to-continuum average flux ratio in the core ( $\pm 0.15$  nm from central  $\lambda$ ) of the Ca II IRT lines in radiative equilibrium. The activity flux  $\mathcal{F}'$  at the stellar surface, being either chromospheric activity or accretion flux, can be obtained by the relation:

$$\mathcal{F}' = \mathcal{F}_c \Delta W \simeq \mathcal{F}_c \langle r_{\lambda} \rangle_{\text{core}} \alpha \quad (5)$$

where  $\mathcal{F}_c$  is the continuum flux at the stellar surface<sup>1</sup>. By analogy to  $R'_{\text{HK}}$ , the  $R'_{\text{IRT}}$  index can therefore be defined as

$$R'_{\text{IRT}} \equiv \frac{\mathcal{F}'}{\sigma T_{\text{eff}}^4} \simeq \left( \frac{\mathcal{F}_c \langle r_{\lambda} \rangle_{\text{core}}}{\sigma T_{\text{eff}}^4} \right) \alpha \quad (6)$$

which gives the flux difference with respect to the radiative equilibrium approximation in the core of the Ca II IRT lines in bolometric flux units and, for  $\alpha > 0$ , is suitable for comparing the activity level over the whole range of parameters explored (see Appendix A).

<sup>1</sup> Note that by expressing  $\mathcal{F}_c$  in  $[\text{W m}^{-2} \text{ nm}^{-1}]$ ,  $\mathcal{F}'$  has units  $[\text{W m}^{-2}]$ , expressing the chromospheric contribution to the flux in the line integrated over a wavelength range around the core of the line.

**Table 1.** Polynomial coefficients for converting  $\alpha$  to  $\log R'_{\text{IRT}}$  using Eq. (7).

[M/H]	$C_0$	$C_1$	$C_2$	$C_3$
-0.50	-3.3391	-0.1564	-0.1046	0.0311
0.00	-3.3467	-0.1989	-0.1020	0.0349
0.25	-3.3501	-0.2137	-0.1029	0.0357
0.50	-3.3527	-0.2219	-0.1056	0.0353

The quantity in brackets in Eq. (6) depends mainly on  $T_{\text{eff}}$ , it is weakly dependent on metallicity and has a negligible dependence on  $\log g$  in the range of parameters explored in Gaia DR3. We approximated the log of this quantity with a third order polynomial in  $\theta = \log T_{\text{eff}}$  for four values of [M/H]. The fit coefficients are reported in Table 1. Using this polynomial fit,  $R'_{\text{IRT}}$  can be estimated from  $\alpha$  and  $T_{\text{eff}}$  for a given [M/H] as:

$$\log R'_{\text{IRT}} \simeq (C_0 + C_1\theta + C_2\theta^2 + C_3\theta^3) + \log \alpha \quad (7)$$

### 3. Scientific validation

ESP-CS has processed stars with  $G < 13$ ,  $T_{\text{eff}}$  in the range (3000 K, 7000 K),  $\log g$  in the (3.0, 5.5) range, and [M/H] in the (-1.0, 1.0) range. The activity index  $\alpha$  has been estimated on a total of approximately 2M stars; in DR3  $\alpha$  has a range  $\approx (-0.1, 1.0)$ . As an example, Fig. 2 reports the activity index histogram for stars with  $T_{\text{eff}} \in (4000 \text{ K}, 5000 \text{ K})$ . Negative values are physically expected because in low activity stars the chromosphere causes a deeper line absorption than the radiative equilibrium expectation (see Appendix A); uncertainties in the astrophysical parameters can also cause negative values. Nominal uncertainties take the pixel noise into account and are  $\sim 0.001$  nm on average.

The activity index for the bulk of K stars with the lowest  $\log g$  ( $3.0 \leq \log g \leq 3.5$ ) has standard deviation of 0.011 and 0.006

nm in the case of GSP-Spec and GSP-Phot input, respectively (Fig. 2, right panel). Since these stars, which exclude sub-giants in close active binaries like RS CVn systems, have the lowest activity in the parameter range explored, such standard deviations can be taken as upper limits of the random errors of the whole sample. The average activity index for these stars is 0.002 nm for both the GSP-Phot and GSP-Spec input; this can be considered an upper limit to the true bias.

Astrophysical parameters for rapidly rotating and emission line stars are generally provided by GSP-Phot only. Since these are also the most active stars, the distribution with GSP-Phot input is peaked and extended to larger values than the distribution of the activity index with GSP-Spec input.

### 3.1. Activity index vs $T_{\text{eff}}$

Fig. 3 shows the 2D density plot  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  with input parameters from GSP-Phot and GSP-Spec separately. In the dataset with input parameters from GSP-Phot (Fig. 3, upper left panel), the high activity part, say for  $\log R'_{\text{IRT}} \gtrsim -5.5$ , is characterised by two almost horizontal branches, bending towards lower  $R'_{\text{IRT}}$  values at decreasing  $T_{\text{eff}}$  below 4000 K and disappearing below 3500 K.

The clustering of  $R'_{\text{IRT}}$  in these three different regimes is further outlined in the histogram shown in Fig. 4. The highest branch (very high activity, VHA, hereafter) has a lower limit between  $\log R'_{\text{IRT}} \simeq -4.8$  and  $-5.0$ , depending on  $T_{\text{eff}}$ . The second highest branch (high activity, HA, hereafter) has a lower limit between  $\log R'_{\text{IRT}} \simeq -5.3$  and  $-5.5$ , depending on  $T_{\text{eff}}$ . The limit between the second highest branch and the bulk of low-activity stars (LA hereafter) is at  $\log R'_{\text{IRT}} \simeq -5.35$ .

There is a clear gap between the HA-branch and the LA-branch starting at  $T_{\text{eff}} \simeq 5400$  K and  $\log R'_{\text{IRT}} \simeq -5.35$  and growing at decreasing  $T_{\text{eff}}$ , until it disappears at  $T_{\text{eff}} \simeq 4500$  K (upper left panel of Fig. 3). This gap, however, disappears when considering stars with  $\log g > 4.0$  only (Fig. 3, middle left panel). The comparison between the upper panels and the middle ( $\log g > 4.0$ ) and lower ( $\log g < 4.0$ ) panels of Fig. 3 reveals that the structure of low-activity stars bending down in this  $T_{\text{eff}}$  range is, in fact, populated by more evolved stars, approximately in the sub-giant branch of the HRD, with a low level of chromospheric activity.

These results are consistent with what found by Henry et al. (1996); Gomes da Silva et al. (2021), who suggested a grouping of very active stars with  $\log R'_{\text{HK}} > -4.2$  (corresponding approximately to  $\log R'_{\text{IRT}} > -5.2$ , according to the correlation discussed in Sect. 3.2) and very inactive stars with  $\log R'_{\text{HK}} < -5.1$  (corresponding approximately to  $\log R'_{\text{IRT}} > -5.8$ ), with a regime of active stars in between these values.

The same density plot with input parameters from GSP-Spec (Fig. 3, upper right panel) does not show such clustering. This is likely due to the higher dispersion of  $R'_{\text{IRT}}$  with input parameters from GSP-Spec (as suggested by a visual comparison between the two diagrams in Fig. 3 and supported by the comparison with  $R'_{\text{HK}}$  in Sect. 3.2) and the lack of GSP-Spec parameters for active and fast-rotating stars that populate the higher part of the diagram (see Sects. 3.4 and 3.6). Note that the higher dispersion of  $R'_{\text{IRT}}$  with input from GSP-Spec suggested by Fig. 3 is consistent with the higher  $\alpha$  dispersion found in stars with  $T_{\text{eff}} \in (4000 \text{ K}, 5000 \text{ K})$  and  $\log g \in (3.0, 3.5)$  (see above and Fig. 2).

In Fig. 5 some Ca II IRT sample spectra of stars in the different regimes are shown: a subgiant and a dwarf in the LA regime, a dwarf in the HA regime and an accreting star (one in the Upper

Scorpius association reported in Table 2 and Fig. 8) in the VHA regime. The spectra are compared with the template and the enhancement with respect to the template spectrum is shown.

The activity distribution is found to be very different for  $T_{\text{eff}} \lesssim 3500$  K, which corresponds to the transition between partially-convective to fully convective stars. Fig. 3 shows that stars close to the partially-convective / fully convective boundary have a large drop in chromospheric activity, which increases again with decreasing  $T_{\text{eff}}$  (mass) in the fully-convective regime. A paucity of stars is found in the  $T_{\text{eff}}\text{-}\log R'_{\text{IRT}}$  diagram at  $3300 \text{ K} \lesssim T_{\text{eff}} \lesssim 3500 \text{ K}$ , likely connected to the gap in the mid-M dwarfs main sequence found by Jao et al. (2018), linked to the onset of full convection in M dwarfs (Jao et al. 2018; Mayne 2010; MacDonald & Gizis 2018; Baraffe & Chabrier 2018).

### 3.2. Comparison with the $R'_{\text{HK}}$ chromospheric activity index

In order to relate  $R'_{\text{IRT}}$  with  $R'_{\text{HK}}$ , we have estimated  $R'_{\text{HK}}$  on ESO-FEROS archive spectra and further considered the data provided by Boro Saikia et al. (2018), which includes a compilation of  $R'_{\text{HK}}$  values from various surveys plus their own measurements on archive HARPS spectra. For simplicity, our approximate estimate of  $R'_{\text{HK}}$  from FEROS spectra have been carried out as in Linsky et al. (1979), without considering more recent calibrations of the H & K surface flux (Middelkoop 1982; Rutten 1984) nor rescaling to the Mount Wilson data as in Boro Saikia et al. (2018).

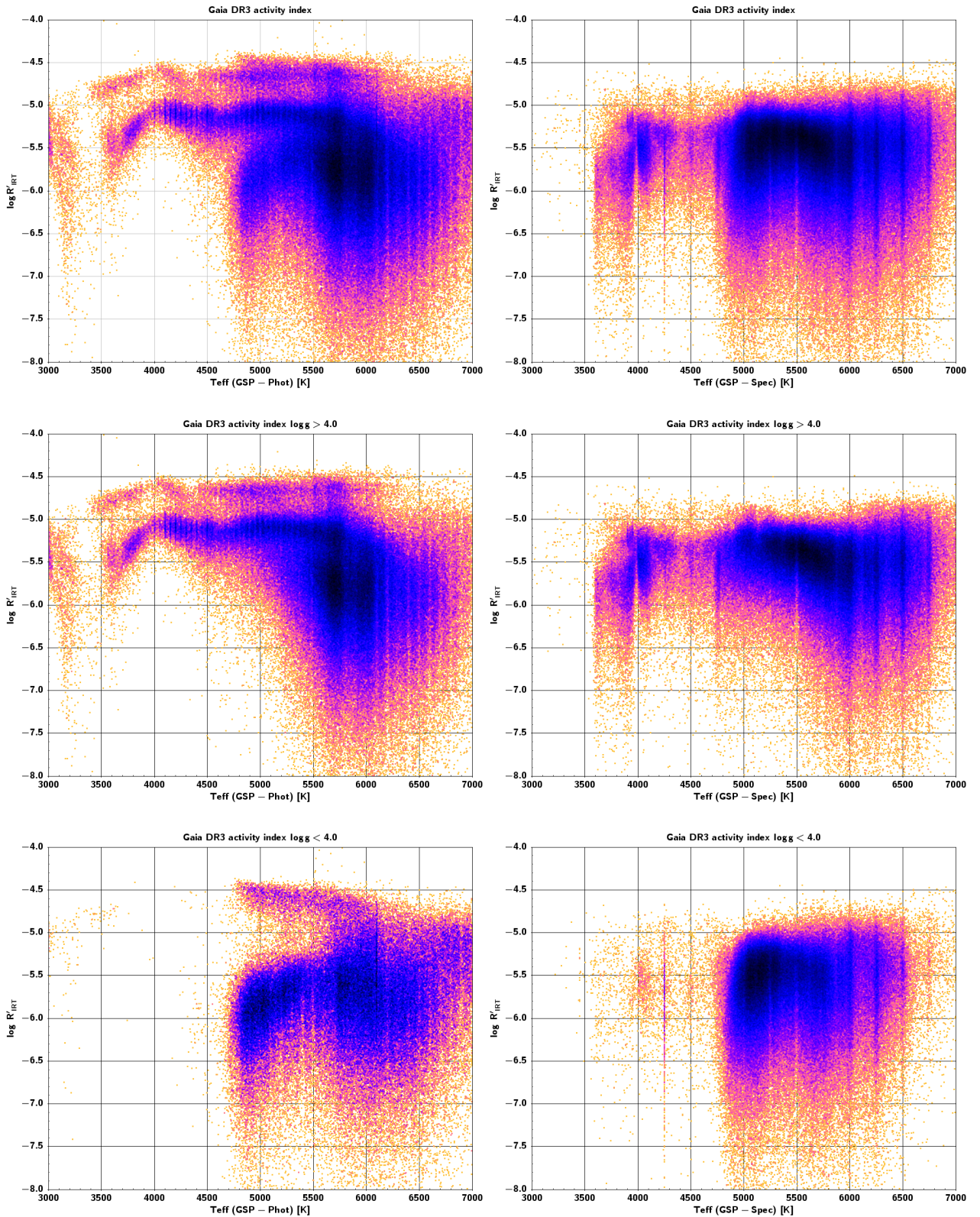
Deriving an accurate  $R'_{\text{IRT}}$  vs  $R'_{\text{HK}}$  relationship would require a consistent estimate of the photospheric contribution and a homogenisation of the methods used in deriving  $R'_{\text{HK}}$ , considering also the non-simultaneity of the measurements and the intrinsic variability of chromospheric activity. This is outside the scope of the present work and is left for future work, together with the publication of the  $R'_{\text{HK}}$  values from archive FEROS spectra. Here we just aim at verifying the existence of the correlation between  $R'_{\text{IRT}}$  and  $R'_{\text{HK}}$  and at providing some preliminary approximate relationships between the two parameters.

Cross-match with the *Gaia* DR3 activity index leads to 671 objects in common with our  $R'_{\text{HK}}$  estimate from FEROS spectra (362 with GSP-Spec and 309 with GSP-Phot input parameters) and 220 objects in common with the Boro Saikia et al. (2018) dataset. As discussed above (see Figs. 2 and 4),  $R'_{\text{IRT}}$  with GSP-Spec input is characterised by a larger dispersion and is more concentrated on the lower activity range, while  $R'_{\text{IRT}}$  with GSP-Phot input has a lower dispersion and extends to a higher activity range. The cross-match with the FEROS data reflects this situation; in Fig. 7, showing the  $R'_{\text{IRT}}$  vs  $R'_{\text{HK}}$  dispersion diagram, data with GSP-Spec input covers mostly the lower left part while data with GSP-Phot input covers mostly the upper right part of the diagram. Data with GSP-Spec input is also affected by a larger dispersion than data with GSP-Phot input or the Boro Saikia et al. (2018) dataset.

The  $R'_{\text{IRT}}$  with GSP-Phot input is well correlated with FEROS  $R'_{\text{HK}}$ , with a Pearson linear correlation coefficient  $r = 0.73$  and

$$\log R'_{\text{IRT}} = 0.68066 \log R'_{\text{HK}} - 2.53461 \quad (8)$$

The  $R'_{\text{IRT}}$  with GSP-Spec input is poorly correlated with FEROS  $R'_{\text{HK}}$ , having  $r = 0.31$ ; this is mainly due to the fact that the GSP-Spec APs in *Gaia* DR3 concern mostly stars with a low level of activity and therefore a regime in which the activity index signal-to-noise ratio is lower. The larger variance of  $\alpha$  with GSP-Spec input with respect to the GSP-Phot input (see above and Fig. 2, right panel), could itself be due to the lower activity

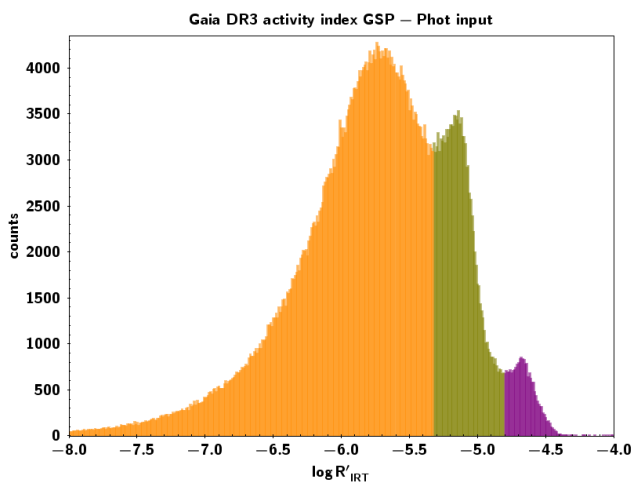


**Fig. 3.** Density plots of  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  with input parameters from GSP-Phot (upper left panel) and from GSP-Spec (upper right panel). The same plots are repeated in the middle panels for  $\log g > 4.0$  and in the lower panels for  $\log g < 4.0$ .

index signal-to-noise ratio in the regime covered by GSP-Spec, or to an intrinsically larger variance of the GSP-Spec APs. Despite such limitations, the activity index derived with GSP-Spec input APs maintains its validity of a relative chromospheric activity indicator in the LA regime.

Correlation with the Boro Saikia et al. (2018) dataset has  $r = 0.50$  and

$$\log R'_{\text{IRT}} = 0.65691 \log R'_{\text{HK}} - 2.45543 \quad (9)$$



**Fig. 4.** Histogram of  $\log R'_{\text{IRT}}$  with input from GSP-Phot (bin size 0.01). The highest branch (VHA) is coloured in purple and has a lower limit between  $-4.8$  and  $-5.0$ , depending on  $T_{\text{eff}}$ . The second highest branch (HA) is coloured in green and has a lower limit between  $-5.3$  and  $-5.5$ , depending on  $T_{\text{eff}}$ . The remaining of the distribution (LA) is coloured in orange.

### 3.3. Position in the colour-magnitude diagram

Consistency of the activity index scale is verified also by examining the position of the three branches in the *Gaia* CMD ( $M_G$  vs  $(G_{\text{BP}} - G_{\text{RP}})$  corrected for interstellar extinction, Andrae 2022). Fig. 6 shows the position of sub-samples of each branch superimposed on the CMD of all sources for which the activity index has been derived. The range of input APs considered implies that the CMD in Fig. 6 includes the lower MS, the sub-giant branch and the PMS regions. The MS, in turn, is split in two sequences, the over-density associated with the higher one notoriously due mainly to binary stars, but with PMS stars transiting over the same region while they contract towards the ZAMS. In the following, we shall refer to the single star MS as single-MS and to the binary star MS as binary-MS. In order to consider homogeneous results that include PMS and fast-rotating stars, only results with GSP-Phot input are shown.

The first panel of Fig. 6 shows that stars in the VHA-branch ( $R'_{\text{IRT}} \gtrsim -4.8$ ) are preferentially located above the single-MS, the higher  $R'_{\text{IRT}}$  the higher the tendency to be located at larger distance above the single-MS. Note, however, that some of the most active stars are located on or close to the single- and binary-star MS. Furthermore, some of the most active stars are early-K stars at  $\sim 2-4$  mag above the MS. The second panel of Fig. 6 shows that stars in the HA-branch ( $-5.3 \lesssim R'_{\text{IRT}} \lesssim -4.8$ ) are mostly concentrated on the single-MS, with some star on the binary-MS and a few above the MS. Contrary to the VHA stars location, the region of early-K stars at  $\sim 2-4$  mag above the MS, where we can find RS CVn's and PMS, is essentially void of HA stars. The third panel shows that stars in the LA-branch ( $R'_{\text{IRT}} \lesssim -5.3$ ) are mostly concentrated in the F- G-type MS and a few in the sub-giant region. Consistently with the discussion in Sect 3.1 (Fig. 3), the late-K, M stars region is almost void of LA stars. LA stars populate the early-K region at  $\sim 2-4$  mag above the MS, with some of the least active stars concentrated here.

In support of the scientific validity of the results published in *Gaia* DR3, in the following sections we discuss the consistency with current knowledge of the distribution of the three branches in the CMD.

**Table 2.** Accretion rates ( $\log \dot{M}$  in  $[M_{\odot}/\text{yr}]$ ) and references for selected sources in Fig. 8. References: [1] Lanzafame et al. (2015), [2] Alcalá et al. (2014), [3] Manara et al. (2020), [4] Venuti et al. (2019).

GDR3 source_id	$R'_{\text{IRT}}$	$\log \dot{M}$	Cluster / Association	Ref.
5519263533510676224	-4.63	-9.88	$\gamma$ Vel.	[1]
3104345255664954368	-4.61	-9.19	NGC 2232	[1]
5201153035509861888	-4.67	-9.47	Chamaeleon I	[1]
5201226389256838528	-4.70	-8.63	Chamaeleon I	[1]
3340972772281842944	-4.54	-9.54	$\lambda$ Ori	[1]
3340894500797788288	-4.56	-8.16	$\lambda$ Ori	[1]
3340999023121894912	-4.54	-7.88	$\lambda$ Ori	[1]
5997006897751436544	-4.70	-9.32	Lupus	[2]
5997082390415552768	-4.73	-8.73	Lupus	[2]
6237190612936085120	-4.74	-7.80	Upper Scorpius	[3]
6244083039015457664	-4.58	-9.05	Upper Scorpius	[3]
6243393817024157184	-4.64	-10.51	Upper Scorpius	[3]
6243130106031671168	-4.75	-10.97	Upper Scorpius	[3]
6248768740952946816	-4.61	-9.58	Upper Scorpius	[3]
6245777283349430912	-4.53	-8.76	Upper Scorpius	[3]
5401795662560500352	-4.37	-8.59	TW Hydra	[4]

### 3.4. The very high activity branch

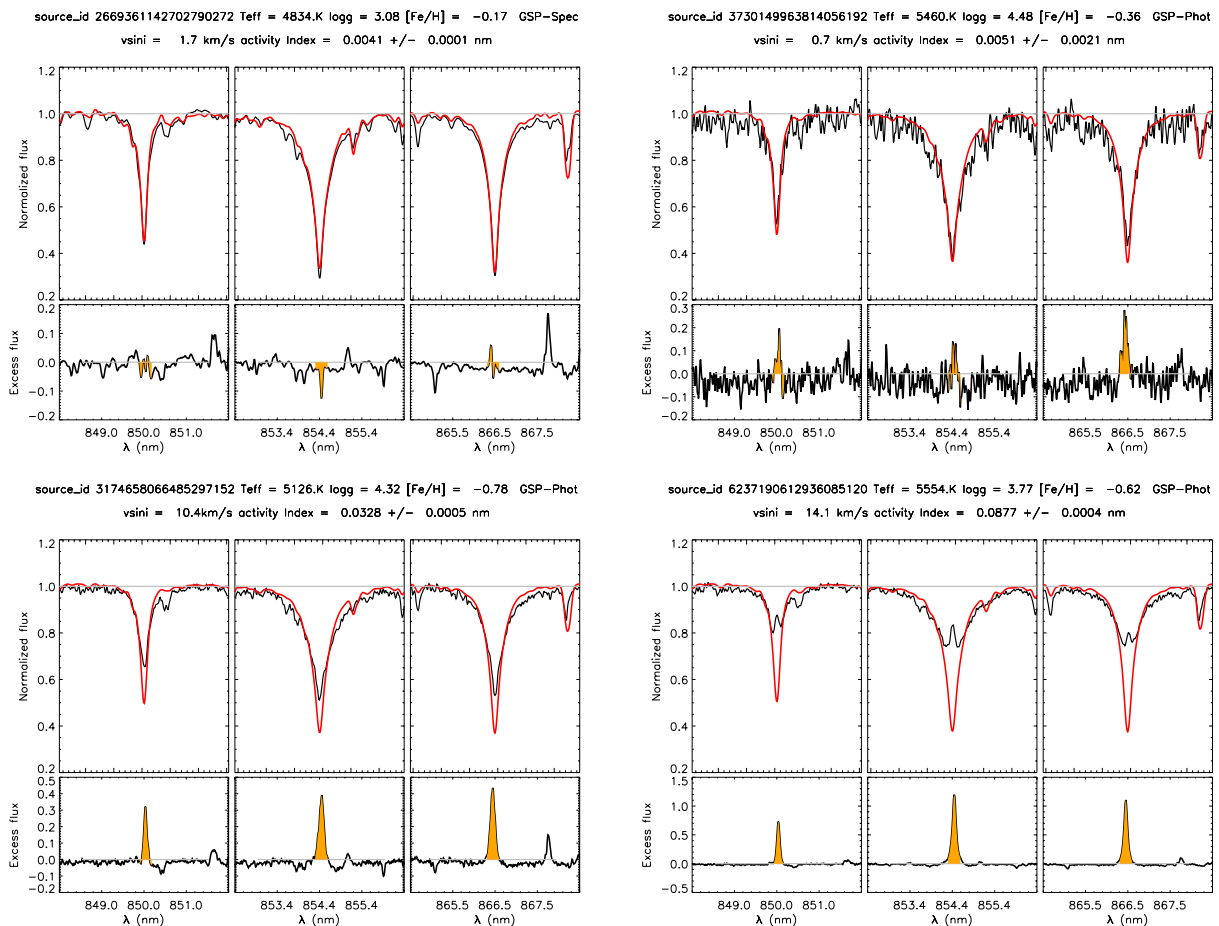
Cross-match of stars in the VHA-branch with the SIMBAD database shows that these objects are mostly classified as PMS stars, including YSO, T Tau, and Orion-type variables. A few RS CVn's are also present.

In PMS stars, mass accretion can cause an excess flux in the  $\text{Ca II IRT}$  lines that dominates over the chromospheric flux (see Appendix B). Fig. 8 shows the comparison of  $R'_{\text{IRT}}$  with mass accretion rate ( $\log \dot{M}$ ) for 17 objects for which an estimate of the mass accretion rate is available. The  $\log \dot{M}$  estimates in Fig. 8 comes from either the  $\text{H}\alpha$  width at 10% of the peak (Natta et al. 2004; Alcalá et al. 2014) measured by the *Gaia*-ESO survey (Lanzafame et al. 2015)<sup>2</sup> or derived from the excess continuum emission (see, e.g. Manara et al. 2015). The source identification, membership, and  $\log \dot{M}$  references are reported in Table 2. The  $\log R'_{\text{IRT}}$  vs  $\log \dot{M}$  correlation is weak in all cases, i.e. considering the whole set, the measurements based on  $\text{H}\alpha$  width at 10% of the peak or on the excess continuum ( $r \sim 0.3$ ). Nevertheless, all these objects have  $R'_{\text{IRT}} > -4.8$ .

Previous knowledge (e.g. Linsky 2017, and references therein), indicates that VHA stars on or close to the binary-MS can be identified as either chromospherically active dwarf stars in binary systems or PMS stars. Stars located above the binary-MS can also be identified as PMS/T Tauri stars at an earlier phase of contraction towards the ZAMS, or, when they are located in the sub-giant region, as RS CVn systems in which at least one component is a sub-giant. The distribution of VHA stars in the CMD (Fig. 6, upper panel), is consistent with this scenario, confirming the validity of the *Gaia* DR3 activity index. This situation suggests also that amongst stars in the very active branch ( $R'_{\text{IRT}} \gtrsim -4.8$ ) there is a superposition of mass-accreting stars and stars with enhanced activity, as that induced by tidal interaction in close binary system like RS CVn. As a consequence, the separation between the very high activity branch and the high activity branch seen in the upper left panel of Fig 3 can be due to the rapid decrease of mass accretion in PMS stars, but the very high activity branch is populated by both PMS accreting stars and other very active systems like RS CVn. The HA branch is therefore expected to be populated by chromospherically active stars with no mass accretion (see also Sect. 3.6). A dividing line between pure chromospheric activity and mass accretion dominated regimes can be placed at  $\log R'_{\text{IRT}}$  values between approximately  $-4.8$  and  $-5.0$ , depending on  $T_{\text{eff}}$  (see also Fig. 4), but a

<sup>2</sup> Data available at <https://www.eso.org/qi/catalogQuery/index/121>





**Fig. 5.** Ca II IRT sample spectra in the different regimes. In each panel, the spectra (black line) are compared with the template (red line). The enhancement factor, i.e. the integrand of Eq. (1), is reported below the spectrum, and the integral producing  $\alpha$  is outlined in orange. Upper left panel: LA subgiant with  $\log R'_{\text{IRT}} = -6.04$ . Upper right panel: LA dwarf with  $\log R'_{\text{IRT}} = -5.98$ . Lower left panel: HA dwarf with  $\log R'_{\text{IRT}} = -5.19$ . Lower right panel: an accreting star (one in the Upper Scorpius association reported in Table 2 and Fig. 8) in the VHA regime.

value of  $\log R'_{\text{IRT}}$  above this limit may be due to enhanced activity in RS CVn systems as well.

### 3.5. The High- and low-activity branches: the Vaughan-Preston gap

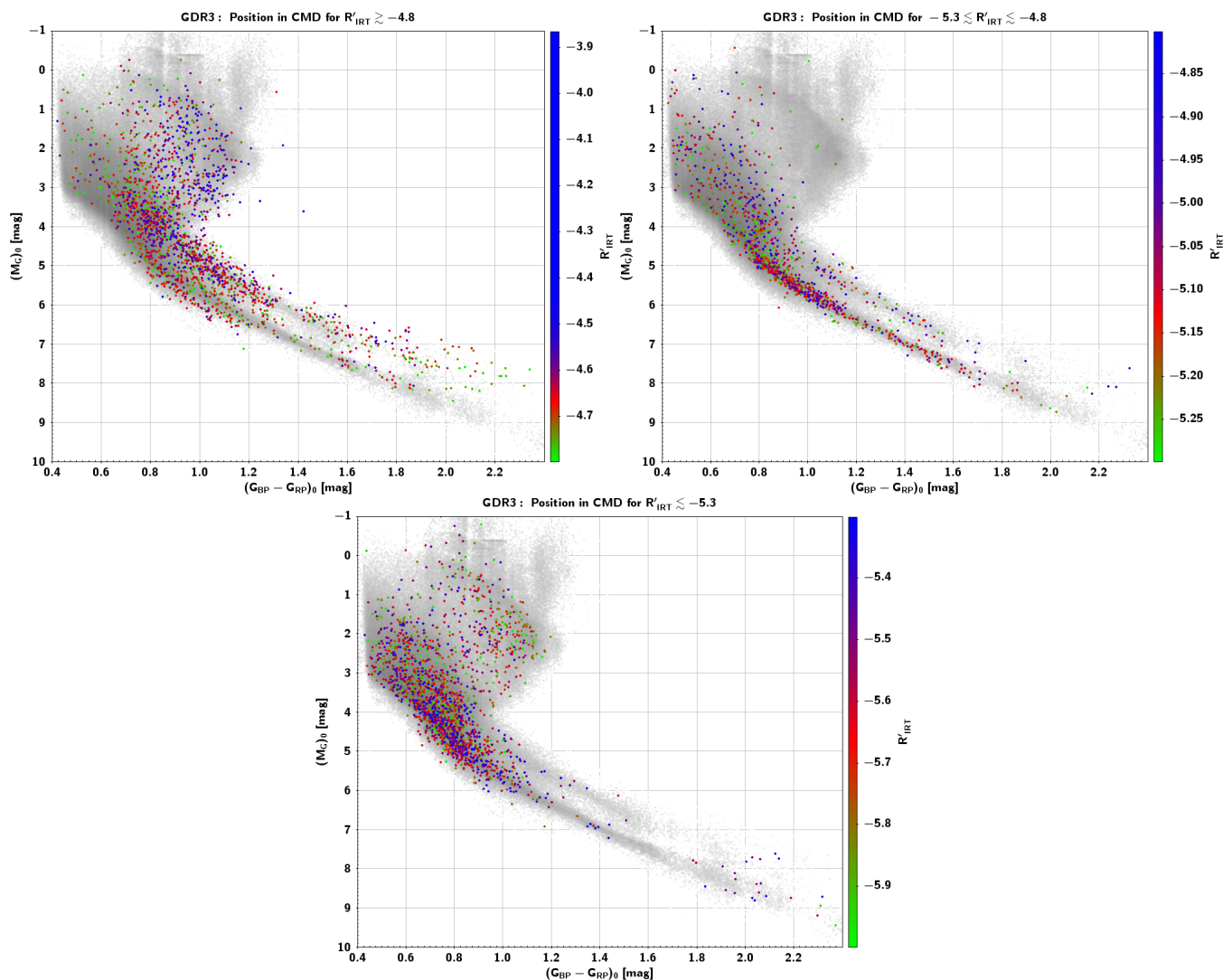
Vaughan & Preston (1980) found a gap at some intermediate level of chromospheric activity in F and G stars observed in the Mount Wilson project. This gap has been thoroughly discussed in the literature with different interpretations (e.g. Durney et al. 1981; Noyes et al. 1984; Rutten 1987; Pace et al. 2009). Recently, Boro Saikia et al. (2018) investigated this issue using their extensive compilation of  $R'_{\text{HK}}$ , finding that for F, G, and early K stars this gap is indeed not so apparent. They found, instead, that moving towards late-K and early-M dwarfs the concentration of stars on the active side of the gap increases and decreases on the low-activity side.

The plots in Fig. 3 confirm the Boro Saikia et al. (2018) findings. Considering only stars with  $\log g > 4.0$  and excluding the upper branch populated by pre-main sequence stars, we find no clear evidence of a gap at  $T_{\text{eff}}$  corresponding to F, G, and early-K stars. The middle panels of Fig. 3, on the other hand, confirm the disappearance of low-activity stars at decreasing  $T_{\text{eff}}$ . Below  $\approx 4500$  K, only the high activity branch essentially remains,

which bends toward lower activity below  $\approx 4000$  K. Then, below  $\approx 3500$  K the spread in  $R'_{\text{IRT}}$  increases dramatically and the branch is not distinguishable any longer.

Indeed, the histogram in Fig. 4 does show a decrease in the number of stars at  $\log R'_{\text{IRT}} \approx -5.4$ , which would suggest a bimodal distribution in chromospheric activity with a clear minimum in between. The histograms shown in Fig. 9, however, shows that the two peaks on both side of this minimum are mostly due to the combination of the different  $R'_{\text{IRT}}$  distributions for stars cooler and hotter than  $T_{\text{eff}} \approx 5000$  K. Restricting the sample to stars with  $\log g > 4.0$  and not considering stars in the highest activity branch populated by PMS stars, the distribution of stars with  $T_{\text{eff}} \geq 5000$  K peaks at  $\log R'_{\text{IRT}} \approx -5.70$  and has only a bump at  $R'_{\text{IRT}} \approx -5.20$ , showing only a shallow minimum in between, which remains so even restricting further the bin size. On the other hand, the distribution of dwarfs with  $T_{\text{eff}} \lesssim 5000$  K peaks at  $\log R'_{\text{IRT}} \approx -5.13$  and shows no bump on neither sides of the maximum. The cumulative distribution, which gathers together the different behaviour on either sides of  $T_{\text{eff}} \approx 5000$  K boundary, shows a double peak with a clear minimum at  $\log R'_{\text{IRT}} \approx -5.38$ .

All stars with  $\log g < 4.0$  (Fig. 9, right panel) below  $\log R'_{\text{IRT}} \approx -4.8$  have a unimodal distribution, those with  $T_{\text{eff}} < 5000$  K peaking at  $\log R'_{\text{IRT}} \approx -5.9$  and those with  $T_{\text{eff}} < 5000$  K peaking at  $\log R'_{\text{IRT}} \approx -5.7$ . The distribution of stars



**Fig. 6.** Position in the CMD, corrected for interstellar extinction, of stars in the VHA (upper left panel), HA (upper right panel) and LA (lower panel) branches. Input APs are from GSP-Phot. The density plot of all sources for which the activity index has been derived is shown in grey on the background. The position of sub-samples of  $\sim 2000$  stars per branch are shown in each panel, colour coded according to  $R'_{\text{IRT}}$ . See text for details.

with  $\log g < 4.0$  has also a secondary peak above  $\log R'_{\text{IRT}} \approx -4.8$ , which may be associated with sub-giants in close binaries with enhanced activity.

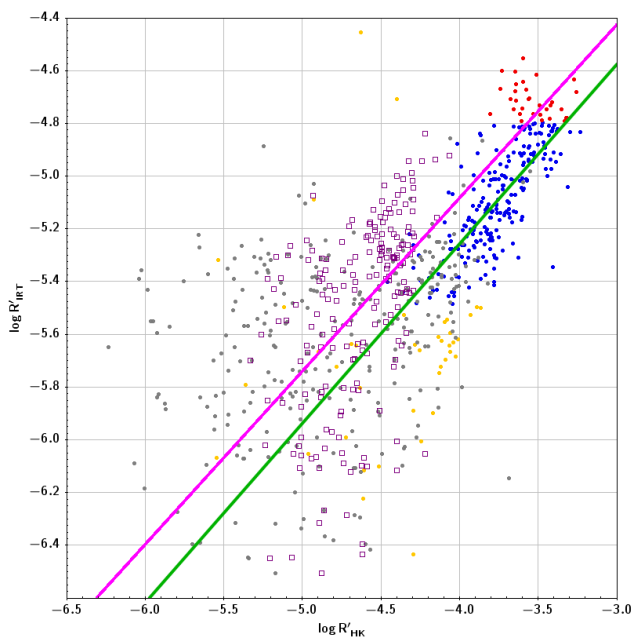
In summary, only dwarfs with  $T_{\text{eff}} \geq 5000$  K show a hint of a bimodal distribution, with central values at  $\log R'_{\text{IRT}} \approx -5.70$  and  $-5.20$ , but without a clear gap in between. Notably, according to Eqs. (8) and (9), the Vaughan-Preston gap at  $\log R'_{\text{HK}} \approx -4.75$  corresponds to  $\log R'_{\text{IRT}} \approx -5.60$ , which places it in between the estimated central values of the high (HA) and low-activity (LA) branches.

### 3.6. Comparison with rotational modulation

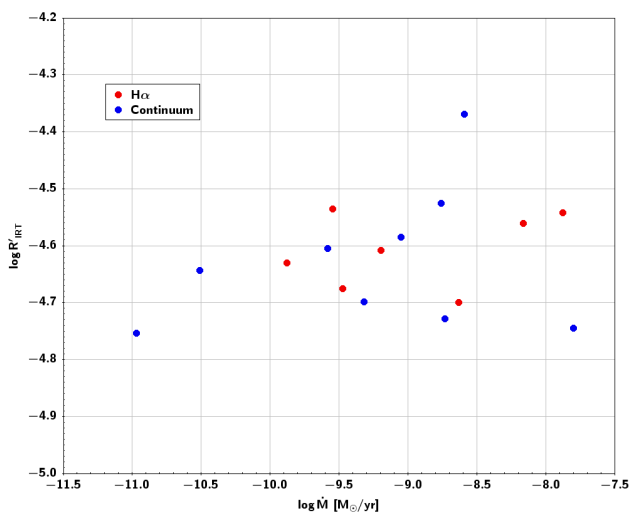
The DPAC analysis includes the detection and characterisation of rotational modulation due to photospheric active regions (variability coordination unit, CU7, Lanzafame et al. 2018). *Gaia* DR2 included rotational modulation data for some 150 000 stars (Lanzafame et al. 2018) and *Gaia* DR3 includes data for some 500 000 stars (Distefano et al. 2022).

Lanzafame et al. (2019) found that the rotational modulation amplitude distribution in *Gaia* DR2 data shows a clear bimodality, with an evident gap at an amplitude  $A \approx 0.04 - 0.05$  mag. The low amplitude branch, in turn, shows a period bimodality with a main clustering at periods  $P \approx 5 - 10$  d and a secondary clustering of ultra-fast rotators at  $P \lesssim 0.5$  d. These three different branches in the period–amplitude diagram were named high amplitude rotators (HAR), low-amplitude fast-rotators (LAFR), and low-amplitude slow-rotators (LASR). Lanzafame et al. (2019) interpreted these branches as signatures of different surface inhomogeneity regimes and suggested possible scenarios for their evolution. The amplitude–period multimodality was found to be correlated with the position in the period–absolute magnitude (or period–color) diagram, with the low- and high-amplitude stars occupying different preferential locations.

Fig. 10 shows the positions of stars with different rotation modulation amplitude  $A$  in the  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  density diagram. A clear correlation between  $R'_{\text{IRT}}$  and  $A$  is found ( $r \approx 0.6$ ), as expected (see e.g. Linsky 2017, and references therein), which increases when considered on a  $T_{\text{eff}}$  by  $T_{\text{eff}}$  basis ( $r \approx 0.7$ ). A con-



**Fig. 7.** Comparison of  $\log R'_{\text{IRT}}$  vs  $\log R'_{\text{HK}}$  obtained from ESO-FEROS archive spectra and with  $\log R'_{\text{HK}}$  from Boro Saikia et al. (2018). Stars with  $R'_{\text{IRT}}$  obtained from GSP-Phot input and placed in the HA-branch are plotted in blue, those in the VHA-branch in red, and those in the LA-branch in orange. Stars with  $R'_{\text{IRT}}$  obtained from GSP-Spec input are plotted in grey. The linear fit to data with GSP-Phot input is plotted in green (Eq. (8)). The comparison with  $R'_{\text{HK}}$  from Boro Saikia et al. (2018) is shown with open purple squares, and the corresponding linear fit with a purple line (Eq. (9)).



**Fig. 8.** Activity index ( $\log R'_{\text{IRT}}$ ) vs accretion rate ( $\log \dot{M}$ ) for selected sources. Red filled circles indicate accretion rates derived from the width of  $H\alpha$  at 10% of the peak by the Gaia-ESO survey (Lanzafame et al. 2015, and references therein). Blue filled circles indicate accretion rates derived from the excess continuum emission (see, e.g. Manara et al. 2015). See Table 2 for the sources of the accretion rate estimates.

firmation on the consistency between rotational modulation and the activity index data in Gaia DR3 comes also from the comparison with the branches identified in Lanzafame et al. (2019). Stars in HAR-branch of the period-amplitude diagram are found to be located in the VHA-branch of the  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  density diagram. Note that the HAR-branch is populated mainly by

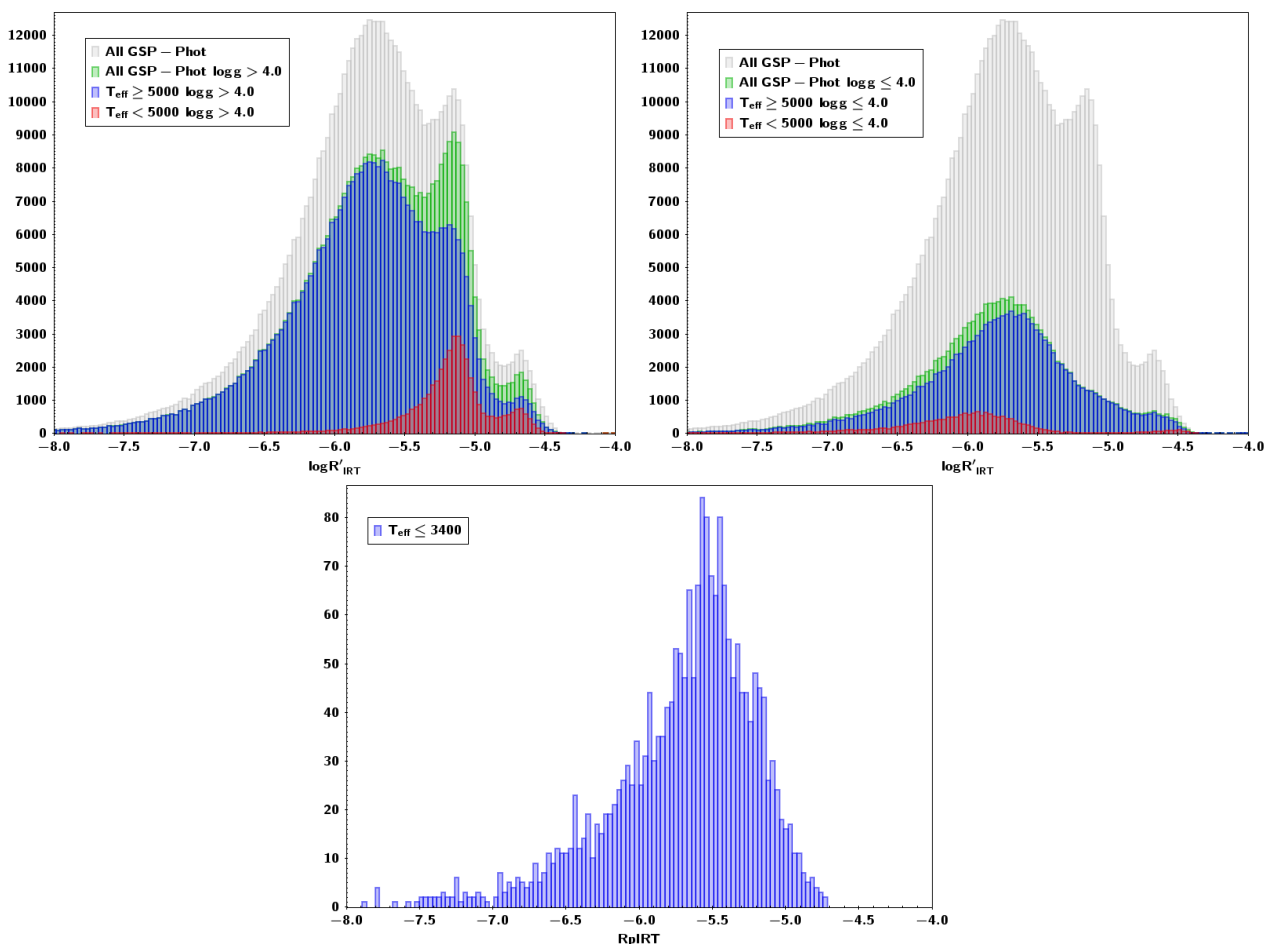
PMS stars (Lanzafame et al. 2019) as it is the VHA-branch (see Sect. 3.4). Stars in the LASR-branch of the period–amplitude diagram are found in the HA and LA branches of the  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  density diagram, with the highest  $A$  in this range mostly located in the HA branch.

The position in the  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  density diagram of the few LAFR stars in common is of particular interest. Lanzafame et al. (2019) suggested that the small modulation amplitude of stars in the LAFR branch may be due to a high degree of axisymmetry of the surface magnetic field. If this were the main difference compared to the HAR branch, one could naively expect the chromospheric activity in the LAFR and HAR branches to be quite similar. The bottom left panel of Fig. 10 suggests, instead, a more complex scenario. Most of the LAFR with  $T_{\text{eff}} \lesssim 5000$  K are placed on the HA branch, the lowest available in this  $T_{\text{eff}}$  range, with only one star on the VHA branch. LAFR stars with  $T_{\text{eff}} \gtrsim 5000$  K are mostly in the LA branch, with a few on the HA branch and only one in the VHA branch. In general, there is no clear evidence of a correlation between chromospheric and photospheric activity in LAFR stars, but both are, unlike HAR stars, at low level. This suggests that a high degree of axisymmetry of the surface magnetic field may not be the only cause of the low rotational modulation amplitude in these stars, but rather that magnetic activity is inhibited in LAFR stars with respect to HAR stars with similar rotation period. It may be argued that the LAFR sample may be contaminated by stars above the Kraft limit, i.e. stars with a radiative core and a convective envelope, because of an incorrect estimate of both interstellar extinction and  $T_{\text{eff}}$ . The variability in this case could be due to stellar pulsation rather than rotational modulation. Although we cannot exclude the presence of contaminants in the LAFR sample, there is evidence that at least a good fraction of them are real low-mass stars. In fact, about 50 of them have APs in very good agreement between GSP-Phot and GSP-Spec, this latter being not affected by interstellar absorption. Furthermore, from the stars' distance we estimate that for at least 50% of them the interstellar extinction estimate by GSP-Phot should be biased by more than 3 mag/kpc to be high-mass stars that appear as low-mass stars, which is deemed quite unlikely.

## 4. Conclusions

Gaia DR3 contains the largest chromospheric activity index catalogue obtained to date. The activity index has been derived from the  $\text{Ca II IRT}$  observed by the *Gaia* Radial Velocity Spectrometer (RVS) for 2 141 643 stars in the Galaxy, with  $G < 13$ ,  $T_{\text{eff}} \in (3000 \text{ K}, 7000 \text{ K})$ ,  $\log g \in (3.0, 5.5)$ , and  $[M/H] \in (-1.0, 1.0)$ . In this paper we described the method used and the results from the scientific validation. We also provided a simple formula (Eq. (7)) to convert the parameter published in the catalogue (`activityindex_espcs`) to the  $R'_{\text{IRT}}$  index, analogous to the  $R'_{\text{HK}}$  index derived from the  $\text{Ca II H \& K}$  doublet, suitable for comparing the activity level over the whole range of parameters explored in Gaia DR3.

The scientific validation of the activity index obtained using the GSP-Phot parameters as input confirms the existence of three different regimes, which we called very high activity (VHA,  $\log R'_{\text{IRT}} \gtrsim -4.8$ ), high activity (HA,  $-5.4 \lesssim \log R'_{\text{IRT}} \lesssim -4.8$ ), and low activity (LA,  $\log R'_{\text{IRT}} \lesssim -5.4$ ). The activity index obtained using the GSP-Spec parameters as input do not show such clusterings because of an evident larger dispersion with respect to the results obtained with the GSP-Phot input and the GSP-Spec filtering applied to the most active stars like fast-rotator and PMS. The activity regimes found with the GSP-Phot input



**Fig. 9.**  $\log R'_{\text{IRT}}$  histograms (bin size 0.03) for  $\log g > 4.0$  (upper left panel) and  $\log g \leq 4.0$  (upper right panel). In the upper panels, the distribution for  $T_{\text{eff}} \geq 5000$  K and  $T_{\text{eff}} < 5000$  K are compared with the global distributions. The distribution for  $T_{\text{eff}} \leq 3400$  K (fully convective stars) is shown in the bottom panel. In order to extend the comparison to the very active branch on an homogeneous set, only results with GSP-Phot input are visualised.

are consistent with those suggested by Henry et al. (1996) and confirmed recently by Gomes da Silva et al. (2021) from the analysis of  $R'_{\text{HK}}$ .

The VHA regime is found to be populated by PMS stars and close binary system like RS CVn's. In the former, the excess flux with respect to the radiative equilibrium condition may be dominated by mass accretion. In the latter, magnetic activity may be significantly enhanced by tidal interaction. A comparison between  $R'_{\text{IRT}}$  and mass accretion rate  $\dot{M}$  for a few PMS stars in the sample (Fig. 8) shows that, although the two parameters are not clearly correlated, a value  $\log R'_{\text{IRT}} \gtrsim -4.8$  may indicate a significant mass accretion flux contribution to the emission core of Ca II IRT. Indeed, the gap between the VHA branch and the rest of the distribution in the  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  diagram (Fig. 3) can be due to the rapid transition from the regime dominated by mass accretion to the regime dominated by magneto-acoustic heating of the chromosphere.

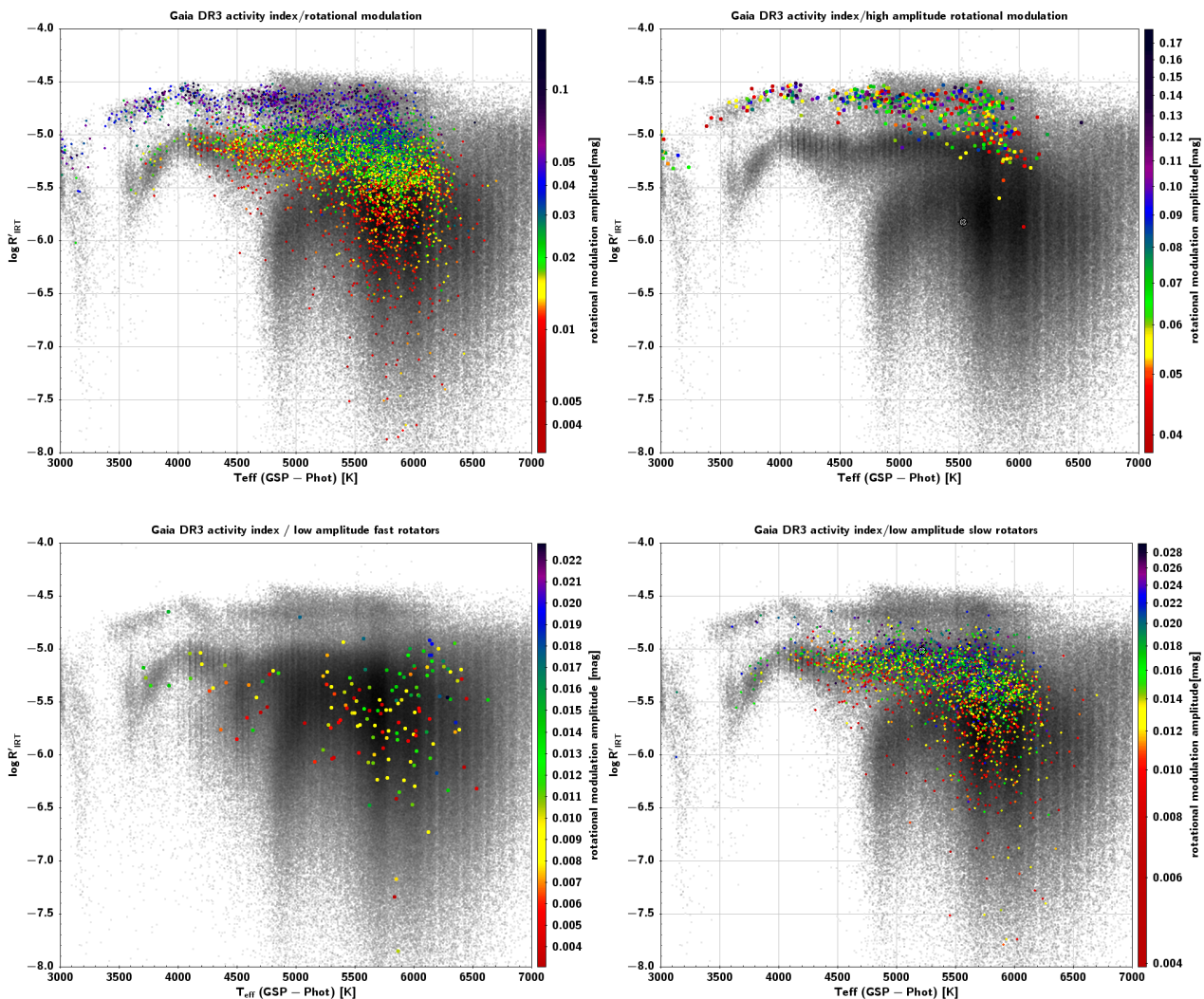
The  $R'_{\text{IRT}}$  distribution (Fig. 9) is found to depend on  $T_{\text{eff}}$  and  $\log g$ . Stars with  $T_{\text{eff}} < 5000$  K and  $\log g > 4.0$  are in the HA and VHA branches. Excluding the VHA, the distribution of these stars in the HA branch is unimodal, peaking at  $\log R'_{\text{IRT}} \approx -5.13$ . The distribution of stars with  $T_{\text{eff}} \geq 5000$  K and  $\log g > 4.0$ , on the other hand, peaks at  $\log R'_{\text{IRT}} \approx -5.70$  and has a bump at  $R'_{\text{IRT}} \approx -5.20$ , with a shallow minimum in between. This minimum corresponds approximately to the location of the Vaughan-

Preston gap at  $\log R'_{\text{HK}} \approx -4.75$  (Vaughan & Preston 1980), but this range is far from being void of stars, confirming Boro Saikia et al. (2018) finding. Stars with  $T_{\text{eff}} \geq 5000$  K and  $\log g > 4.0$  are therefore found in all three regimes, while stars with  $T_{\text{eff}} < 5000$  K and  $\log g > 4.0$  are found in the VHA and HA regimes only.

Stars with  $\log g \in (3.0, 4.0)$  have unimodal distributions in the LA regime, peaking at  $\log R'_{\text{IRT}} \approx -5.9$  for  $T_{\text{eff}} < 5000$  K, and at  $\log R'_{\text{IRT}} \approx -5.7$  for  $T_{\text{eff}} \geq 5000$  K. There are also a few cases in the VHA regime, likely to be subgiants in close binaries with enhanced activity.

The activity distribution is found to change dramatically in the fully convective regime (Fig. 3). Stars close to the partially-convective / fully convective boundary have a large drop in chromospheric activity, then, at decreasing  $T_{\text{eff}}$  (mass), activity increases again to reach approximately the same level of partially-convective stars in the HA branch. A paucity of stars is found in the  $T_{\text{eff}} - \log R'_{\text{IRT}}$  diagram at  $3300 \text{ K} \leq T_{\text{eff}} \leq 3500 \text{ K}$ , likely connected to the gap in the mid-M dwarfs main sequence found by Jao et al. (2018), linked to the onset of full convection in M dwarfs.

The  $R'_{\text{IRT}}$  index derived from the Gaia DR3 activity index is well correlated with  $R'_{\text{HK}}$  from Boro Saikia et al. (2018), who gathered together a compilation of values from various surveys plus their own measurements on archive HARPS spectra. We



**Fig. 10.**  $\log R'_{\text{IRT}}$  vs  $T_{\text{eff}}$  density diagram from ( $T_{\text{eff}}$  from GSP-Phot) with Gaia DR3 rotational modulation data overlaid (8171 sources in common). Top left panel: comparison with the whole rotational modulation dataset colour-coded according to the rotational modulation amplitude  $A$ . Top right panel: same as top left panel for just the high-amplitude rotator (HAR) branch. Bottom left panel: same as top left panel for just the low-amplitude fast-rotator (LAFR) branch. Bottom right panel: same as top left panel for just the low-amplitude slow-rotator (LASR) branch.

find also good correlation with a preliminary  $R'_{\text{HK}}$  estimate made on ESO-FEROS archive spectra, which will be subject of a future work.

The correlation of  $R'_{\text{IRT}}$  with the position in the *Gaia* CMD (Fig. 6) is in line with the current knowledge of the activity evolution of low-mass stars (see, e.g. Linsky 2017). Stars in the VHA branch, which according to a cross-match with the SIMBAD database includes PMS stars and RSCVn systems, are preferentially located above the single star MS, the higher  $R'_{\text{IRT}}$  the higher the tendency to be located at larger distance above the MS. A group of very active early-K stars is found at  $\sim 2-4$  mag above the MS. Some very active stars are also located close to the single- and binary-star MS. Stars in the HA branch tend to be on the single star MS, with some star on the binary-MS and a few above the MS. The region of early-K stars at  $\sim 2-4$  mag above the MS is essentially void of HA stars. Finally, stars in the LA branch are mostly concentrated in the F- G-type MS and in the sub-giant region, with the early-K region at  $\sim 2-4$  mag above the MS populated with some of the most inactive stars. In this latter region we have therefore a superposition of VHA (close binaries or PMS stars) and LA stars (very inactive sub-giants).

The  $T_{\text{eff}} - \log R'_{\text{IRT}}$  diagram has a neat and unambiguous correspondence with the period–amplitude diagram (PAD) of the rotational modulation due to photospheric spot and faculae (Lanzafame et al. 2018, 2019; Distefano et al. 2022). Stars in the high amplitude rotator branch (HAR) of the PAD, as identified for the first time by Lanzafame et al. (2019) in the Gaia DR2 data, has a clear correspondence with the VHA branch in the  $T_{\text{eff}} - \log R'_{\text{IRT}}$  diagram. Both are populated by young, PMS stars. The low-amplitude slow-rotator branch (LASR) of the PAD corresponds to the HA and LA branches of the  $T_{\text{eff}} - \log R'_{\text{IRT}}$  diagram.

The position of the low-amplitude fast-rotator (LAFR) stars in the  $T_{\text{eff}} - \log R'_{\text{IRT}}$  diagram is particularly interesting. Despite the high rotation velocity, these stars have both low rotational modulation amplitude and most of them also low chromospheric activity index. The former may be due either to a small photospheric active regions filling factor or to a high degree of axisymmetry of the surface magnetic field. The latter can only be due to a global low level of magneto-acoustic heating of the chromosphere, with the axisymmetry of the surface magnetic field expected to play essentially no role. The evidence points therefore to a global low level of photospheric and chromospheric activ-

ity rather than to a high degree of axisymmetry of the surface magnetic field in these fast rotating stars. Moreover, Distefano et al. (2022), who presented the rotational modulation data in *Gaia* DR3, find a low correlation between the  $G$  variation due to rotational modulation and the  $(G_{BP} - G_{RP})$  colour variation in LAFR stars, which, combined with the low rotational modulation amplitude and the small chromospheric activity index, strengthen the evidence of the presence of smaller active regions in this branch compared with stars in the HAR branch with similar rotation period. In general there is a good correlation between the chromospheric activity index and the amplitude of the rotational modulation due to spot and faculae, which is tighter when examined on limited colour or  $T_{\text{eff}}$  bins.

Overall, the scientific validation of the *Gaia* DR3 stellar activity index derived from the analysis of the Ca II IRT observed by RVS demonstrates a high level of consistency with previous results, most of them obtained from the analysis of the Ca II H & K doublet, extending these results to a much larger sample. The richness of the *Gaia* sample allows us to derive the distribution of the stellar activity over stellar fundamental parameters with an unprecedented level of details, outlining different regimes of chromospheric heating and identifying those where the emission due to mass accretion processes may dominate over a purely chromospheric emission. The activity index provided in *Gaia* DR3 represents therefore a gold mine for several investigations like: verifying/falsifying theoretical models of the stellar dynamo and of the emergence of stellar active regions; identifying stars with a low RV jitter in the search of Earth-like planets; studying the impact of magnetic activity in the derivation of accurate elemental abundance in stellar atmospheres; studying the evolution of the magnetic activity for different stellar mass and its impact on the host exoplanets; studying the magnetic activity in close binary systems.

## Appendix A: Chromospheric activity indices

A chromospheric activity index gives a relative measure of the non-radiative energy dissipated in the stellar chromosphere. For thorough reviews of our current understanding of stellar chromospheres we refer to Linsky (2017) and Carlsson et al. (2019). Here, we summarise the basic concepts at the basis of the definition of a chromospheric activity index, its usage as chromospheric diagnostics, and compare the activity index defined in this work with other indices and definitions in the literature.

The best known chromospheric activity index is the  $R'_{\text{HK}}$  derived from the Ca II H and K doublet at  $\lambda = 393.4$  nm and 396.9 nm (see, e.g. Linsky et al. 1979; Noyes et al. 1984, and references therein). This index provides a measure of the chromospheric radiative flux in the H and K lines, in units of the bolometric flux:

$$R'_{\text{HK}} \equiv \frac{\mathcal{F}'(\text{H}_1) + \mathcal{F}'(\text{K}_1)}{\sigma T_{\text{eff}}^4} \quad (\text{A.1})$$

where  $\mathcal{F}'(\text{H}_1)$  and  $\mathcal{F}'(\text{K}_1)$  are the chromospheric contribution to the flux at stellar surface in the H and K lines and  $\sigma$  the Boltzmann constant. The chromospheric flux in the Ca II H and K doublet is identified as the flux in the emission core of the lines, integrated over the wavelength ranges  $\text{H}_1$  and  $\text{K}_1$  between the flux minima, corrected by the photospheric contribution:

$$\mathcal{F}'(\text{H}_1) = \mathcal{F}(\text{H}_1) - \mathcal{F}_{\text{phot}}(\text{H}_1) \quad (\text{A.2})$$

$$\mathcal{F}'(\text{K}_1) = \mathcal{F}(\text{K}_1) - \mathcal{F}_{\text{phot}}(\text{K}_1) \quad (\text{A.3})$$

A purely empirical derivation of  $R'_{\text{HK}}$  requires narrow-band absolute photometry (Vaughan et al. 1978) or a combination of spectroscopy and narrow-band absolute photometry (Linsky et al. 1979). In these cases, the calibration of  $\mathcal{F}(\text{H}_1)$  and  $\mathcal{F}(\text{K}_1)$  is performed by taking the ratio of the signal in the core of the lines and in nearby wavelength intervals (e.g. the  $S$  index, Vaughan et al. 1978; Noyes et al. 1984) and then applying an absolute flux calibration to the nearby intervals. A purely empirical derivation of  $R'_{\text{HK}}$  also requires knowledge of the angular stellar diameter  $\phi'$  since, ignoring interstellar absorption, the flux at stellar surface  $\mathcal{F}(\Delta\lambda)$  is related to the observed flux  $f(\Delta\lambda)$  by:

$$\mathcal{F}(\Delta\lambda) = f(\Delta\lambda) \left(\frac{d}{R}\right)^2 = f(\Delta\lambda) \left(\frac{4.125 \cdot 10^8}{\phi'}\right)^2 \quad (\text{A.4})$$

with  $\phi'$  in mas.

The low NUV continuum flux in late-type stars makes diagnostics like Ca II H and K and Mg h and k (at  $\lambda = 279.6$  nm and 280.4 nm) particularly sensitive to chromospheric activity, as the core of these lines may be driven into emission more easily than in spectral regions where the photospheric continuum flux is much higher. On the other hand, a faint underlying continuum makes the flux calibration technique described above difficult, and therefore this approach may become unfeasible below some limiting  $T_{\text{eff}}$ .

A similar approach can be applied to other chromospheric diagnostics having a much higher underlying continuum, like H $\alpha$  and Ca II IRT. In such cases, because of the unfavourable line/continuum contrast effect, low or moderate chromospheric activity produce some extra absorption (Cram & Mullan 1979) or just a fill-in in the line core; only relatively high levels of magnetic activity may drive the core of the lines into emission.

The chromospheric component of the line can be revealed by comparing the target spectrum with a purely photospheric spectrum with the same  $T_{\text{eff}}$ ,  $\log g$ , and  $[\text{M}/\text{H}]$ . When a non-negligible

chromospheric activity is present, the difference or ratio spectrum reveals some extra absorption or emission. An estimate of the chromospheric flux can be conveniently done using the residual equivalent width

$$\Delta W \equiv \int_{\Delta\lambda} [r(\lambda) - r_{\text{phot}}(\lambda)] d\lambda, \quad (\text{A.5})$$

where

$$r(\lambda) \equiv \frac{f(\lambda)}{f_c(\lambda)} \quad (\text{A.6})$$

is the continuum normalised spectrum, so that

$$\mathcal{F}'(\Delta\lambda) = \mathcal{F}_c \Delta W \quad (\text{A.7})$$

where  $\mathcal{F}_c$  is the absolute flux in the underlying or nearby continuum. With the help of Eq. (A.7), the definition of  $R'_{\text{HK}}$  can be generalised to any spectral line whose core is formed in the chromosphere:

$$R'_{\Delta\lambda} \equiv \frac{\mathcal{F}'(\Delta\lambda)}{\sigma T_{\text{eff}}^4} \quad (\text{A.8})$$

where  $\Delta\lambda$  is the approximate wavelength range embracing the line core. Because of the increasing line absorption for increasing activity levels in the low activity regime, the relationship between  $\Delta W$  and the activity level is expected to be double-valued for given  $T_{\text{eff}}$ ,  $\log g$ , and  $[\text{M}/\text{H}]$ , and therefore only activity levels above a certain threshold can be put on a relative scale using lines with a strong underlying continuum like H $\alpha$  and Ca II IRT.

The photospheric reference spectrum  $r_{\text{phot}}(\lambda)$  can be taken as the spectrum of an inactive star with  $T_{\text{eff}}$ ,  $\log g$ , and  $[\text{M}/\text{H}]$  as close as possible to the target star (Herbig 1985), a combination of inactive star spectra (see, e.g., Frasca & Catalano 1994; Frasca et al. 2015; Lanzafame et al. 2015), or synthetic spectra (e.g. Andretta et al. 2005; Busà et al. 2007, and references therein).

The choice of adopting observed spectra of inactive stars as template  $r_{\text{phot}}$  in Eq. (A.5) aims at obtaining results that are as much as possible model independent. The main conceptual problem here is how to define an inactive star. From a purely observational point of view, the seemingly obvious choice is to select stars with the deepest absorption amongst those with similar  $T_{\text{eff}}$ ,  $\log g$ , and  $[\text{M}/\text{H}]$  (e.g. Lanzafame et al. 2015; Frasca et al. 2015; Žerjal et al. 2017). As noted above, this introduces ambiguities, since in the presence of a strong underlying continuum the deepest absorption does not correspond to the lowest chromospheric activity level. Another important caveat is that setting up a grid of reference inactive stellar spectra that cover the relevant parameter space with sufficient density and accuracy can be costly and prone to subjective choices.

It should also be noted that photospheric synthetic spectra are built under the assumption of radiative equilibrium (RE), but chromospheric activity is superimposed on a basal emission originating from the dissipation of acoustic energy (Schrijver et al. 1989), and therefore it is expected that RE breaks down in the upper photosphere of all late-type stars, even for the lowest chromospheric activity level. When synthetic spectra are adopted as templates,  $r_{\text{phot}}$  in Eq. (A.5) is replaced with  $r_{\text{RE}}$ , the continuum normalised spectrum under the RE assumption. Since this is deduced from simple *ab initio* assumption,  $r_{\text{RE}}$  is a robust reference, but it is not expected to be realised in the upper photosphere of any real star. Non-local thermodynamic equilibrium (NLTE) effects in the line core should also be taken into

account. However, Andretta et al. (2005) found that NLTE effect on the Ca II IRT lines equivalent widths are negligible (10%) except for very low-metallicity models ( $[M/H] \approx -2.0$ , 30%), increasing with decreasing  $T_{\text{eff}}$  and decreasing  $\log g$ .

In summary, using templates built by interpolating over a grid of LTE synthetic spectra is a practical and robust choice by which stars can be put on a relative chromospheric activity scale provided:

- $\Delta W$  is positive and above a certain threshold set by uncertainties in the model and observations;
- A scale of  $\Delta W$  is built for similar values of  $T_{\text{eff}}$ ,  $\log g$ , and  $[M/H]$ , or, alternatively, a relative flux scale is built using Eq. (A.8)

## Appendix B: Ca II IRT as mass accretion indicator

In the pre-main sequence phase, after the main phase of mass accretion, young stars, both classical T Tauri stars (CTTSs) and the higher mass Herbig AeBe stars, accrete mass from their protostellar disk. A generally accepted model for this evolutionary stage (magnetospheric infall and accretion shock, Hartmann et al. 2016; Calvet & Gullbring 1998; Muzerolle et al. 2001) involves downflows from the protostellar disk along magnetic field lines which produce a shock near the stellar photosphere. X-ray and UV photons generated in the shock front both heat the photosphere below, producing hot spots, and are reprocessed in the accreting gas to produce far-UV (FUV) and near-UV (NUV) continua and emission lines. This model explains the observed hot optical/UV excess continuum emission, which manifest itself in the Balmer jump emission and the filling in, commonly referred to as “veiling”, of photospheric absorption lines; its strength is correlated with the mass infall rate (e.g. Muzerolle et al. 1998, and references therein). Key features of emission lines in CTTSs include redshifted absorption components, blue-ward asymmetries in the profile, as well as the presence of broad and narrow components. The narrow component observed in the Ca II IRT and He I (587.6 nm) was found to be correlated with veiling and NIR excess by Batalha et al. (1996). Muzerolle et al. (1998), on the other hand, suggested that the broad emission component of the H $\alpha$ , the higher Paschen series, Ca II IRT, He I (587.6 nm), O I (777.3, 844.6 nm), and Na D are formed in the turbulent magnetosphere of the star. Many weak line T Tauri stars (WTTS) have the same age of CTTSs but do not show excess continuum emission nor strong emission lines. This support the scenario in which once accretion is completed the CTTSs become WTTS; in CTTSs the continuum excess emission and the strong emission lines are dominated by the accretion processes, while only magnetic activity characterise the WTTSs spectra. The magnetic activity and accretion effects are superimposed, and while high mass accretion rates produce continuum and lines emission that dominate completely the stellar chromospheric emission, for the mostly slowly accreting stars the stellar chromosphere may hide the accretion emission (Ingleby et al. 2011).

High level of the Ca II IRT activity index are therefore undoubtedly associated with mass accretion in CTTSs. However, the transition from a chromospheric- to accretion-dominated regimes is not sharp and the two regimes are expected to overlap somewhat. In the context of the RAVE survey, Žerjal et al. (2017) found a bimodal distribution of the excess emission in the Ca II IRT with a primary peak associated with “inactive” stars and a secondary peak at higher excess emission associated with young stars. A much well defined boundary between chromospheric activity and accretion dominated regimes has been

found by Lanzafame et al. (2015); Frasca et al. (2015); Barrado y Navascués & Martín (2003) analysing the H $\alpha$  emission flux as a function of  $T_{\text{eff}}$ .

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