

# IGRINS RV: A Python Package for Precision Radial Velocities with Near-Infrared Spectra

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# Summary

The relative radial velocity of a star with respect to the Sun can be calculated from its electromagnetic spectrum using the Doppler Effect. This line-of-sight motion, called the Radial Velocity (RV), is an essential tool for astrophysicists. RVs are not only used to detect and characterize exoplanets, but also play a key role in studies of binary stars, star clusters, and moving group member identification.

In the past decade, RVs have primarily been measured from spectra in the optical wavelength regime. This is partly because of advancements in detector technology, but also because of the paucity of Earth's atmospheric absorption features (telluric lines) in the optical. Yet for fainter, cooler, smaller stellar object like M-type stars (stars with mass less than half of the Sun), which emit more energy in the Near-Infrared (NIR), observations in the NIR can save a considerable amount of exposure time. Also, M-type stars are the most common type of star. This along with its size increases the detectability of Earth-like planets around them. Moreover, the stellar activity that can drive false positive exoplanet detections, e.g., star spots carried into view by stellar rotation, is shown to be less severe in the NIR compared to optical.

### Statement of need

Current RV pipelines and techniques that can deliver RV precision in tens of m/s (or better) in the NIR, e.g., PySHELL (Cale et al., 2019), wobble (Bedell et al., 2019), SERVAL (Zechmeister et al., 2018) or the PCA-based cross-correlating method used for the SPIRou spectrograph (Moutou et al., 2020), all require instruments that are highly stabilized and have well-characterized wavelength solutions. For example, the iSHELL spectrograph can be equipped with the methane isotopologue gas cell, and the SPIRou and the CARMENES (NIR channel) spectrographs come with uranium-neon hollow-cathode lamps and stabilized Fabry-Perot etalons. The Immersion GRating INfrared Spectrometer (IGRINS) spectrograph (G. Mace et al., 2016; Gregory Mace et al., 2018; Park et al., 2014; Yuk et al., 2010), on the other hand, was not designed to be RV-stable and comes with no means of wavelength calibration accurate enough to achieve RVs precise to tens of m/s using existing techniques. A new approach to extract precision RVs is needed for an echelle spectrograph like IGRINS, which offers fertile ground for RV science with its high resolution (R  $\sim$  45,000) and broad spectral grasp (the full H and K bands).

IGRINS RV is a pipeline tailored for extracting precision RVs from spectra taken with IGRINS on different facilities. This pipeline is built on the forward-modeling methodology that was



successfully applied to CSHELL and PHOENIX spectra (Crockett et al., 2012) that utilized telluric lines as a common-path wavelength calibrator. Compared to RVs obtained by cross-correlation with stellar templates adopted by past studies, IGRINS RV gives three times higher RV precision, about 25–30 m/s, around narrow-line stars in both H and K bands, shown by years of monitoring on two RV standard stars, GJ 281 and HD 26257. IGRINS RV also pushes this technique, using telluric lines as wavelength calibrator for RV calculations, to its limits as studies found the stability of the telluric lines is about 10–20 m/s (Figueira et al., 2010; Seifahrt & Käufl, 2008). Moreover, IGRINS RV is also tailored to take into account specific aspects of the IGRINS instrument, like the variations in spectral resolution across the detector and the year-long K band detector defocus.

IGRINS RV has demonstrated its effectiveness in identifying orbiting companions by successfully recovering the planet-induced RV signals of HD 189733 and Tau Boo A. IGRINS RV lets users choose to obtain absolute RVs or relative RVs, depending on whether their priority is coarse RV characterization or more precise RV monitoring. The code extends the science capabilities of an already powerful spectrograph, which lacked a publicly available RV pipeline until now. It facilitates the detection and/or characterization of exoplanets, binary stars, star clusters, and moving group members, and it enables such studies to be done in a more precise and uniform way.

IGRINS RV makes use of the astropy (Astropy Collaboration et al., 2018, 2013) on handing sky coordinates and barycentric velocity correction, scipy (Virtanen et al., 2020) and numpy (Harris et al., 2020) on mathmatical calculation, nlopt (Box, 1965; Johnson, 2008) on the optimization process, pandas (McKinney, 2010; team, 2020) on data management, and matplotlib (Hunter, 2007) on plotting. We also used a part of code from BMC (Duarte & Watanabe, 2021) for peak detection. IGRINS RV requires that the igrins plp v2.2.0 (Lee et al., 2017) and Telfit (Gullikson et al., 2014) packages be pre-installed. Detailed documentation and tutorials can be found on the GitHub wiki page.

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