

# **Observing the Sun from start to finish: Calibration, data reduction and scientific exploitation of spectropolarimetric data for the tunable Magnetograph.**

PhD dissertation by

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# RESUMEN

En esta tesis se presenta una revisión completa del proceso de adquisición y análisis de observaciones solares. Comenzando con el diseño y la calibración del instrumento TuMag, a bordo de la misión Sunrise III, se detalla su operación y observaciones, el proceso de reducción de datos, los desafíos específicos asociados a los espectropolarímetros basados en Fabry-Pérot y, finalmente, se concluye con un ejemplo de análisis de datos enfocado en magnetogramas solares.

La misión Sunrise III constituye el tercer vuelo del observatorio Sunrise, un telescopio solar de un metro de abertura que opera a una altitud de 37 km, sustentado por un globo estratosférico. En este tercer vuelo, el observatorio incorporó un conjunto completamente nuevo de instrumentos posfocales, incluyendo dos espectropolarímetros basados en espectroscopía de rendija: *el Sunrise Chromospheric Infrared spectro-Polarimeter (SCIP)* y *el Sunrise Spectropolarimeter and Imager (SUSI)*, que operan en el infrarrojo cercano y el ultravioleta, respectivamente, junto con el magnetógrafo sintonizable (*el Tunable Magnetograph*; TuMag), un espectropolarímetro basado en un etalón Fabry-Pérot que trabaja en el visible. Desarrollado íntegramente por la Red Española de Física Solar Aeroespacial (S<sup>3</sup>PC, siglas en inglés de Spanish Space Solar Physics Consortium), TuMag es un espectropolarímetro imaginador capaz de observar tres líneas espectrales: Fe I 5250.2 Å, Fe I 5250.6 Å y Mg I b2 5172.7 Å. Las pruebas de calibración confirmaron su excepcional desempeño, con una calidad óptica superior a  $\lambda/10$ , una resoluciónpectral mejor que 9 pm y eficiencias polarimétricas cercanas al esquema ideal, lo que permite una relación señal a ruido superior a 1700 en mediciones del primer parámetro de Stokes, I.

El vuelo de Sunrise III tuvo lugar entre los días 10 y 16 de julio de 2024, durante los cuales todos los subsistemas funcionaron casi a la perfección. Para el momento en que los datos fueron recibidos, los pasos principales del software de reducción estaban preparados, permitiendo comenzar el proceso de forma inmediata. Aunque este proceso continúa debido a la proximidad entre la recepción de los datos y la preparación de la tesis, los resultados preliminares demuestran la calidad excepcional de los datos obtenidos por TuMag.

Algunos pasos del proceso de reducción son sencillos y de aplicación directa, sin embargo, algunos otros son de naturaleza más compleja y requieren de una atención más detallada. Un ejemplo de estos últimos es el de la corrección de los defectos instrumentales en interferómetros Fabry-Pérot. Mediante una observación simulada de una mancha solar con un etalón en configuración telecéntrica, demostramos la importancia de corregir adecuadamente los efectos del mapa de cavidades. Mostramos a su vez que las correcciones incompletas de los efectos causados por los defectos del etalón pueden generar errores en

el cálculo de velocidades del orden de 200 m/s, y destacamos la relevancia de la corrección de campo plano para mitigar estos efectos. Adicionalmente, presentamos un algoritmo que modela el perfil de transmisión del etalón con el objetivo de mejorar la corrección los efectos causados por los errores de cavidad en observaciones de campo plano, con el objetivo de optimizar las correcciones en espectropolarímetros basados en estos interferómetros, como pueden ser TuMag o SO/PHI.

Una vez que los datos han sido completamente reducidos, están listos para su análisis científico. Para ilustrarlo, concluimos la tesis con una aplicación de homología persistente en magnetogramas solares, una técnica de análisis topológico de datos. Este enfoque demuestra cómo las características magnéticas se pueden identificar por sus características topológicas, lo que potencialmente habilita la detección automática de regiones de alta actividad con mayor probabilidad de erupciones solares.

# SUMMARY

In this thesis, we present a complete overview of the process of acquiring and analyzing solar observations. Centered around the design and calibration of the TuMag instrument aboard the Sunrise III mission, we proceed through its operations and observations, detail the data-reduction process, address specific challenges related to Fabry-Pérot-based spectropolarimeters, and conclude with an example of data analysis focusing on solar magnetograms.

The Sunrise III mission is the third flight of the Sunrise observatory, a one-meter solar telescope operating at an altitude of 37 km, hanging from a stratospheric balloon. For this flight, the observatory introduced a completely new set of post-focal instruments. These include two slit-based spectropolarimeters, *the Sunrise Chromospheric Infrared spectroPolarimeter* (SCIP) and *the Sunrise Spectropolarimeter and Imager* (SUSI), operating in the near-IR and UV, respectively, alongside the Tunable Magnetograph (TuMag), an imaging spectropolarimeter operating in the visible. Developed entirely by the Spanish Space Solar Physics Consortium (S<sup>3</sup>PC), TuMag is a spectropolarimeter based on a Fabry-Pérot interferometer capable of observing three spectral lines: Fe I 5250.2 Å, Fe I 5250.6 Å, and Mg I b2 5172.7 Å. Calibration tests confirmed the TuMag's exceptional performance, with optical quality exceeding  $\lambda/10$ , spectral resolution better than 9 pm, and polarimetric efficiencies close to ideal, enabling a signal-to-noise ratio (S/N) exceeding 1700 in Stoke I measurements.

The Sunrise III flight occurred between the 10<sup>th</sup> and the 16<sup>th</sup> of July 2024, during which all subsystems operated nearly flawlessly. The main steps of the data-reduction pipeline were ready by the time of arrival of the data, allowing for a fast start of the reduction process. While ongoing due to the close timing of data arrival and thesis preparation, preliminary results showcase the exceptional quality of TuMag's data.

Although many steps in the reduction process are straightforward, certain corrections require more detailed attention. For instance, addressing instrumental artifacts in FPI-based spectropolarimeters like TuMag is particularly challenging. Using a simulated sunspot observation with a telecentric FPI, we demonstrate the importance of accurately correcting cavity map effects. We show that incomplete corrections can lead to velocity calculation errors of approximately 200 m/s and emphasize the role of flat-field correction in mitigating these effects. Additionally, we introduce an algorithm that models the etalon's transmission profile to better correct cavity errors in flat-field observations, aiming to enhance corrections for telecentric FPI-based spectropolarimeters, such as TuMag or SO/PHI.

Once the data have been thoroughly reduced, they become ready for scientific analysis. To illustrate this, we conclude with an application of persistent homology—a topological

data analysis technique—on solar magnetograms. This approach demonstrates how magnetic features can be identified through their topological properties, potentially enabling the automatic detection of high-activity regions with elevated flaring probabilities.

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# CHAPTER 1

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## INTRODUCTION

### 1.1 Background

In June 2009, the Sunrise observatory was launched for the first time (Barthol et al., 2011) by NASA's Columbia Scientific Balloon Facility from the Esrange Space Center, in Kiruna, Sweden, aboard a stratospheric balloon. Equipped with a 1-m aperture telescope, a multi-wavelength UV filter imager, SUFI (Gandorfer et al., 2011) and IMaX (Martínez Pillet et al., 2011), a Fabry-Pérot-based spectropolarimeter, Sunrise was the most complex solar payload carried by a stratospheric balloon to date. The near absence of atmosphere at the flying altitude (approximately 36 km), allowed Sunrise to achieve almost several minutes long, seeing-free observations, along with the capability to measure the UV range, which cannot be observed from the ground. Aimed at studying the magnetic fields of the Sun and the dynamics of solar plasma convective flows, the mission was an outstanding success. It resulted in the publication of over a hundred peer-reviewed scientific articles in numerous high-impact journals, including *Astronomy and Astrophysics* (A&A), *The Astrophysical Journal* (APJ), and *Solar Physics*, among others.

Following the success of its first flight, Sunrise embarked on a second journey on June 13, 2013 (Solanki et al., 2017). The primary objective of this second flight was to investigate Active Regions on the Sun, as it remained completely *quiet* throughout the entirety of the first flight. Most of the original components from the first flight were reused for the second flight, with only minor refurbishments needed. This reuse was crucial to achieving a second flight within four years and at a relatively low cost. Despite the minimal modifications to the instrumentation aboard the observatory, the larger solar activity during this second flight yielded fresh perspectives and valuable data, ultimately securing the mission success, despite encountering some technical challenges.

Given the success of the first two flights, a third flight of the Sunrise mission was planned. For this third edition, the telescope was equipped with three post-focal instruments: SUSI, a UV spectropolarimeter (Feller et al., 2025), developed by the Max Planck Institute for Solar System Research (MPS) with contributions from the National Astronomical Observatory of Japan (NAOJ) and the Institute of Space and Astronautical Science (ISAS-JAXA); SCIP, an infrared spectropolarimeter (Katsukawa, 2025) co-developed by NAOJ and the Spanish Space Solar Physics Consortium ( $S^3PC$ ); and TuMag (del Toro Iniesta et al.,

2025), the evolution of the IMaX magnetograph, entirely developed by the S<sup>3</sup>PC. In addition to a new image correlator and wavefront sensing system (CWS), developed by the Leibniz Institute for Solar Physics (KIS), and a new gondola and pointing system, provided by the Johns Hopkins University's Applied Physics Laboratory (APL). Sunrise III was initially scheduled to fly during the summer of 2020 but was postponed to 2022.

The third launch of Sunrise plays a crucial role in this dissertation. This thesis, initiated in 2020, was centered on the development of the data reduction pipeline for the TuMag instrument. According to the original plan, the first half of the thesis was thought for the calibration of the instrument and preparation of the data pipeline. This way, once the mission had been launched, the second half of the thesis could focus on the correction and scientific analysis of the data produced during this third flight. However, this plan (and thus the scope of the thesis) encountered a setback on July 10, 2022, when the third flight of the Sunrise observatory had to be aborted just a few hours after launch due to a mechanical failure during the ascent phase.

The observatory was recovered days later after a brief stay in the Scandinavian Alps. Both the telescope and the instruments were found to be in good condition, allowing for the recovery of the observatory and providing hope for a second attempt. However, the process of retrieving the instruments, disassembling, calibrating, and verifying their condition before relaunching the mission was lengthy, and it was not until the year 2024 that a second attempt became feasible.

In the absence of data produced by Sunrise to process, analyze, and exploit, the scientific work conducted within the framework of this thesis has been compelled to slightly shift its focus. Over these years, I have focused on delving deeper into image correction techniques for data obtained from Fabry-Pérot interferometers, such as TuMag and IMaX. Additionally, we have conducted several studies using data products from other instruments, such as the Polarimetric and Helioseismic Imager aboard Solar Orbiter (SO/PHI; Solanki et al. 2020, Müller et al. 2020) and the Helioseismic and Magnetic Imager of the Solar Dynamic Observatory (SDO/HMI; Scherrer et al. 2012, Pesnell et al. 2012).

It wasn't until the 10<sup>th</sup> of July of 2024 that Sunrise III got its second chance to fly, and this time, the opportunity was not wasted. After a very successful flight that lasted 6 days, the observatory landed in the northern region of Canada on the 16<sup>th</sup> of July. Figure 1.1 shows the trajectory followed by the observatory over these days. The recovery process started immediately after landing, and we were able to lay hands on the data for the first time on September 2024.

## 1.2 Motivations, methodology and objectives.

In experimental sciences, there is a very strong relation between technological and scientific advances due to the simple fact that we cannot draw conclusions from what we cannot see. We believe it is important for experimental scientists, and more specifically, for observational astronomers, to know the limitations and capabilities of the techniques we employ and to understand the functioning of the instruments we use.

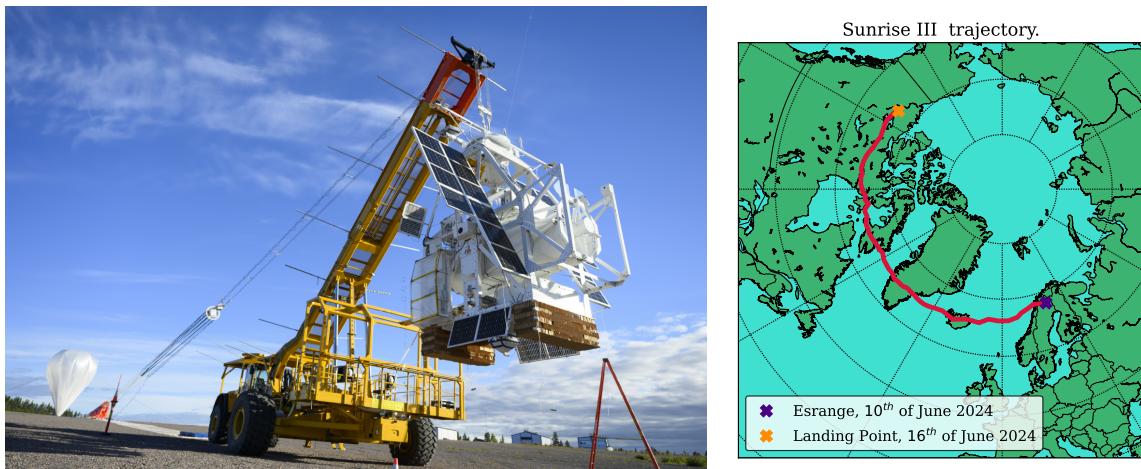


Figure 1.1 Left: Sunrise III minutes before launch on July 10 2024. Image taken from Korpi-Lagg et al. (2025), courtesy: Swedish Space Center / Mattias Forsberg. Right: Trajectory of Sunrise III over the six days of campaign.

This philosophy is one of the pillars of this thesis, which covers topics ranging from the design and calibration of scientific instruments to the exploitation of the data they produce. With this thesis, we aim to provide a broad, yet detailed, view of the various stages of a scientific mission, from its conception and objectives through its design and calibration, data reduction and preparation for scientific exploitation, and finally, the studies and conclusions derived from it.

In particular, I detail this process within the framework of solar physics through the development of TuMag, the magnetograph aboard Sunrise III. In the following chapters, I present the scientific objectives of the mission and attempt to link the design concepts with the scientific questions we aim to answer. I also present the work undertaken during the calibration and commissioning of TuMag, conducted in 2021, 2022, and 2024. Additionally, an independent chapter is devoted to the data-reduction pipeline developed to process TuMag's observations. I also address the challenges encountered in data correction due to the technical or instrumental limitations, a subject of ongoing debate within the community and of current relevance. And lastly, I provide a brief dip into the scientific exploitation that can be carried with the final data product.

Although the topics are diverse, all the work carried for this thesis has a strong computational side. Both TuMag's calibration and its data reduction involved the development of programming tools to assess the performance for the former, and the whole pipeline development for the latter. In the case of the study of the challenges of data reduction, we performed a simulation of a sunspot observation correction and we also developed a novel correction algorithm. In the final study, we applied novel data analysis techniques to the science-ready data and study the possibilities of the analysis technique. All these works involved the development of a series of tools and algorithms, all of which have been written in python.

## 1.3 Introduction

Astronomy is one of the broadest fields of knowledge. It studies everything from the smallest astronomical objects, such as the small asteroids that inhabit our solar system, to the global structure and evolution of the universe, including the study of planetary systems, stars, black holes and the galaxies in which they are found. However, despite the diversity of disciplines—ranging from stellar astronomy, radio astronomy, and cosmology, to extragalactic astronomy, astrobiology, and solar physics—they all share a common tool for studying the cosmos: light. Since the very beginning of astronomy, the astronomer’s work has been to learn how to modify and measure the properties of the photons that reach us in order to infer the characteristics of the observed object. Although recent advancements have provided astronomers with new lenses to *see* the cosmos, like gravitational waves (Abbott et al., 2016) or neutrinos (Davis et al., 1968), among others, light remains as our main resource. Our understanding of the cosmos has always gone hand-in-hand with our ability to design and develop new and clever ways to dissect the light, spanning from the first solar clocks, passing through Galileo’s first telescope to the modern-day spaceborne observatories like Hubble, James Webb or Solar Orbiter.

Solar physics is no different from other astronomical disciplines in this regard. Our main tool to *see* the Sun is light. Contrary to what one may think, if the goal is reaching the diffraction limit of the telescope, solar physicists are as “photon-starved” as any other astronomer. \* Even though our star is closer and (apparently) brighter than any other astronomical object, our requirements regarding resolution and sensitivity are so high that we are as dependent on extremely optimized instrumentation as any other discipline. Thus, the development of instrumentation employing state-of-the-art technology and techniques plays an important role in modern solar physics.

The interplay between technological innovation and our comprehension of the Sun drives the development of numerous new instruments and telescopes whose innovations open the window to new science. Notable examples include the Solar Orbiter mission (Müller et al., 2020), a complex mission developed by the ESA and NASA and launched in February 2020. Equipped with six remote-sensing and four in-situ instruments, Solar Orbiter is designed to study the Sun and the heliosphere from up close and from perspectives beyond the ecliptic, allowing for the monitorization of regions that cannot be observed from Earth such as the poles. Another example is the *Daniel K. Inouye Solar Telescope* (DKIST; Rimmele et al., 2020), a four meter aperture telescope at the Observatory of the Haleakalā Observatory in Hawaii, whose first operations commissioning phase took place in May 2020. With state-of-the-art adaptive optics and the largest aperture of any optical solar telescope worldwide, DKIST achieves an unparalleled spatial resolution, resolving solar features down to approximately 20 km.

The same motivation lies behind the development of Sunrise III and its three instruments. The combination of the one-meter aperture of its telescope, the almost absence of atmosphere, and the diversity of the scientific instruments makes Sunrise’s observations unique. Designed to probe both the photosphere and the chromosphere, Sunrise III pro-

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\*Quote shamelessly appropriated from a talk from J.C. del Toro Iniesta

vides a broad picture of the interaction of the phenomena occurring at both layers with unprecedented level of detail.

Among the three scientific instruments aboard Sunrise is TuMag, a tunable imaging spectropolarimeter operating in the visible range of the optical spectrum, specifically designed to retrieve plasma velocities and magnetic fields in the photosphere and chromosphere. The calibration and data reduction of TuMag represents the core of this thesis, with each topic addressed in its dedicated chapter. Given TuMag's central role in this work, we begin the dissertation with a general overview of the properties and function of spectropolarimeters.

## 1.4 A brief introduction to spectropolarimeters.

As suggested by the name, spectropolarimeters are instruments designed to measure both the spectral and polarimetric properties of light. In other words, they assess the polarization state of light as a function of wavelength. Their use is widely extended in astrophysics, owing to the substantial amount of information that can be inferred about the light source from these properties.

There are two main types of spectropolarimeters, distinguished by their approach to spectroscopy: slit-based spectrographs and narrow-band tunable filtergraphs. The latter preserve spatial coherence by capturing two-dimensional images of the solar scene at the expense of sacrificing spectral resolution. Conversely, slit-based spectrographs provide excellent spectral resolution but the instantaneous two-dimensional information is lost.

Regardless of the method employed for spectroscopy, spectropolarimeters must be able to measure the polarization state of light, in other words, they must determine the Stokes parameters of the incident light. These four parameters, typically expressed as a vector,  $\vec{I} = [I, Q, U, V]^T$ , were introduced by Stokes (Stokes, 1851) as a formalism to fully describe the polarization state of light. The first parameter,  $I$ , accounts for the total intensity, while  $Q$  and  $U$  provide information on the intensity and orientation of linearly polarized light; with the former measuring the difference in intensity between linear polarization at  $0^\circ$  and  $90^\circ$  and the latter between  $45^\circ$  and  $135^\circ$ . Lastly,  $V$  measures the intensity and orientation of circularly polarized light.

Outstanding polarimetric sensitivity and spectral resolution are rendered ineffective if the optical capabilities of the instrument are not up to par. The design of these instruments must achieve a signal-to-noise ratio that ensures the best possible polarimetric sensitivity for stokes  $Q$ ,  $U$  and  $V$ . Additionally, it must provide the best spatial resolution that the telescope allows, all while maintaining high spectral resolution and minimizing observation time. Consequently, instrument design requires a careful balance among these three properties: spectral, optical, and polarimetric capabilities.

In the following sections, we will examine each of these aspects in greater detail, with a particular emphasis on filtergraphs. We begin with an overview of the imaging properties and optical performance assessment of spectropolarimeters, followed by a brief description of how the spectroscopy is carried out. And lastly, we detail how the Stokes components

are computed in spectropolarimeters and present the essential concepts for assessing the polarimetric sensitivities.

### 1.4.1 Imaging properties of Fabry-Pérot-based spectropolarimeters.

Filtergraphs are, first and foremost, imagers. The high-resolution imaging that filtergraph instruments are capable of is one of the pivotal reasons for their extended use. The ability to capture a two-dimensional scene of the solar surface makes them ideal for studying solar plasma structures, which require as large resolutions as possible. These instruments must be able to ensure an image quality and resolving power enough to measure these structures. For this reason, we will begin our description of the filtergraphs with a brief explanation of image formation and image quality assessment.

Let us assume that the extended source we are observing has a intensity distribution in the image plane given by  $O(\xi_0, \eta_0)$ . Then, if we assume a linear, invariant against translations, and continuous optical system and incoherent illumination, the intensity distribution measured at a point  $\xi, \eta$  of the image plane is given by :

$$I_j(\xi, \eta; \lambda_s) = \iint O(\xi_0, \eta_0) S(\xi_0, \eta_0; \xi, \eta; \lambda_s) d\xi_0 d\eta_0, \quad (1.1)$$

where  $S(\xi_0, \eta_0; \xi, \eta; \lambda_s)$  represents the imaging response of the instrument, also referred to as the Point Spread Function (PSF). The PSF describes the normalized intensity distribution in the image plane when observing a point source, which, due to diffraction and inherent imperfections in any imaging system, cannot be imaged as an ideal point.

The PSF is crucial in the assessment of image quality and resolving power of an instrument since it defines how fine detail will be imaged into the detector. One particularly relevant metric for image quality assessment that can be derived from the PSF is the optical transfer function (OTF), which is the Fourier transform of the PSF (Vargas Dominguez, 2009).

$$\text{OTF}(\nu) = \hat{S}(\xi, \eta; \nu), \quad (1.2)$$

where the operator  $\hat{\cdot}$  is the Fourier transform, and  $\nu$  represents the frequency vector in the Fourier domain.

The OTF describes how different spatial frequencies are transferred from the object to the image, thus characterizing the system's ability to resolve fine details. However, since imaging systems measure intensities, we are primarily concerned with how the intensity pattern of an object is transferred to the image plane. A key metric for quantifying this transfer is modulation, or contrast, which is defined as the ratio between the peaks and valleys of intensity at a given spatial frequency:

$$M_\nu = \frac{I_{max}^\nu - I_{min}^\nu}{I_{max}^\nu + I_{min}^\nu}. \quad (1.3)$$

The function that encodes the dependency of the modulation with spatial frequencies is called the modulation transfer function (MTF), and is strictly related to the OTF as the ratio of the modulation of the object  $MTF_{obj}$  and that of the image  $MTF_{im}$ . It can be computed from the magnitude of the OTF (Gaskill, 1978):

$$MTF = \frac{MTF_{im}(\nu)}{MTF_{obj}(\nu)} = |OTF(\nu)|. \quad (1.4)$$

From this definition, it is evident that a perfect optical system would have an  $MTF = 1$  at all spatial frequencies, meaning that all details are perfectly transferred from the object to the image. However, real optical systems exhibit a decrease in MTF as spatial frequency increases. In practice, the resolution of an optical system is often defined as the spatial frequency at which both the MTF and, consequently, the OTF reach zero (Tyson, 2000). This threshold frequency marks the limit beyond which the system can no longer resolve finer details.

Another key concept for assessing the imaging performance is the phase error or wavefront,  $\phi$ . The wavefront of an optical system is defined as the deviation in phase at any point within the image from that of an ideal spherical wavefront (Snyder, 1975). Such deviations arise from various optical imperfections within the imaging system, and their impact on image quality depends on the specific nature of the aberration. For instance, imperfections in mirror shape or lens configuration can result in spherical aberrations, leading to a broadening of the PSF and a subsequent reduction in resolution. Other common aberrations include astigmatism, where the focal point varies along different axes, producing distorted images, and comatic aberrations (coma), which can occur due to misalignment of optical elements and manifest as tail-like distortions in the images of point sources.

It is common to see requirements or assessment of the optical quality of optical instruments in terms of the root mean square (rms) of the variance of the wavefront,  $\Delta\phi(\xi, \eta)$ , usually referred to as the wavefront error ( $W_{rms}$ ):

$$W_{rms} = \sqrt{\frac{1}{A} \int_A \Delta\phi(\xi, \eta)^2 d\xi d\eta}, \quad (1.5)$$

where  $A$  is the area of the aperture.

This value, essentially the standard deviation of the wavefront across the aperture, is closely tied to beam propagation quality. In fact, it can be demonstrated that the wavefront variance can be derived from the Strehl ratio, or viceversa, if only minor aberrations are present. The Strehl ratio is defined as the ratio of the peak intensity of a point source in an aberrated system to that of an ideal system operating at the diffraction limit. It is one of the most widely used metrics for assessing the optical quality of a system, ranging from 1, for a perfect, unaberrated system, to 0. For small aberrations, the Strehl ratio ( $S_R$ ) and  $W_{rms}$  are related by the following expression (Snyder, 1975):

$$S_R \simeq \exp \left[ - \left( \frac{2\pi W_{rms}}{\lambda} \right)^2 \right]. \quad (1.6)$$

Although the Strehl ratio and  $W_{\text{rms}}$  provide a concise measure of the optical quality of a system, the  $W_{\text{rms}}$  contains additional information regarding imaging performance. Rather than relying solely on a single averaged value (such as the standard deviation), the wavefront can be represented as a two-dimensional map projected onto a plane normal to the light path, typically the image plane. To carry out such a representation analytically, it is essential to select an appropriate mathematical framework. Given the widespread use of circular apertures in telescopes, mirrors, lenses, and other optical components, it is advantageous to approach the problem using polar coordinates,  $\rho$  and  $\theta$ , and in particular, to employ an orthonormal basis for the interpretability of the results. Among the multiple (infinite) sets of polynomials that fulfill these requirements, the Zernike polynomials (Zernike, 1934) offer some distinct advantages. The Zernike polynomials are a sequence of polynomials that compose an orthonormal basis over a unit circle. Given an arbitrary wavefront,  $W(\rho, \theta)$ , the expansion in terms of the Zernike polynomials can be expressed as:

$$W(\rho, \theta) = \sum_{n,m} C_n^m Z_n^m(\rho, \theta), \quad (1.7)$$

where  $Z_n^m$  are the Zernike polynomials,  $C_n^m$  are the amplitudes of the coefficients in the expansion and  $n$  and  $m$  are the radial order and angular frequency, respectively. The Zernike polynomials can be obtained from:

$$\left. \begin{aligned} Z_n^m(\rho, \theta) &= R_n^m(\rho) \cos(m\theta), \text{ for } m \geq 0, \\ Z_n^{-m}(\rho, \theta) &= R_n^m(\rho) \sin(m\theta), \text{ for } m < 0 \end{aligned} \right\} \quad (1.8)$$

where  $R_n^m(\rho)$  are the radial functions given by:

$$R_n^m(\rho) = \sum_{l=0}^{(n-m)/2} \frac{(-1)^l (n-l)!}{l! [\frac{1}{2}(n+m)-l]! [\frac{1}{2}(n-m)l-]!} \rho^{n-2l}. \quad (1.9)$$

This representation of the wavefront is particularly valuable because each mode, defined by a specific pair of  $n$  and  $m$  values, corresponds to a distinct aberration in the wavefront, with the associated coefficient representing the contribution to the rms WFE for that specific aberration. Furthermore, the orthogonality of the Zernike basis ensures linear dependence, that is, that adding additional terms to the expansion does not influence the values of previously calculated coefficients. In other words, the Zernike polynomial expansion enables the wavefront to be expressed as the sum of individual aberrations, providing a clear decomposition of wavefront errors.

Figure 1.2 presents an example of a simulated wavefront, including a two-dimensional cross-section and the individual Zernike components of the simulation. The simulation incorporates only the first ten Zernike polynomials, corresponding to polynomials with  $n \leq 3$ , which account for aberrations such as defocus, astigmatism, coma, and trefoil, among others. For a comprehensive overview of the Zernike expansion in wavefront characterization, we direct the reader to Lakshminarayanan & Fleck (2011).

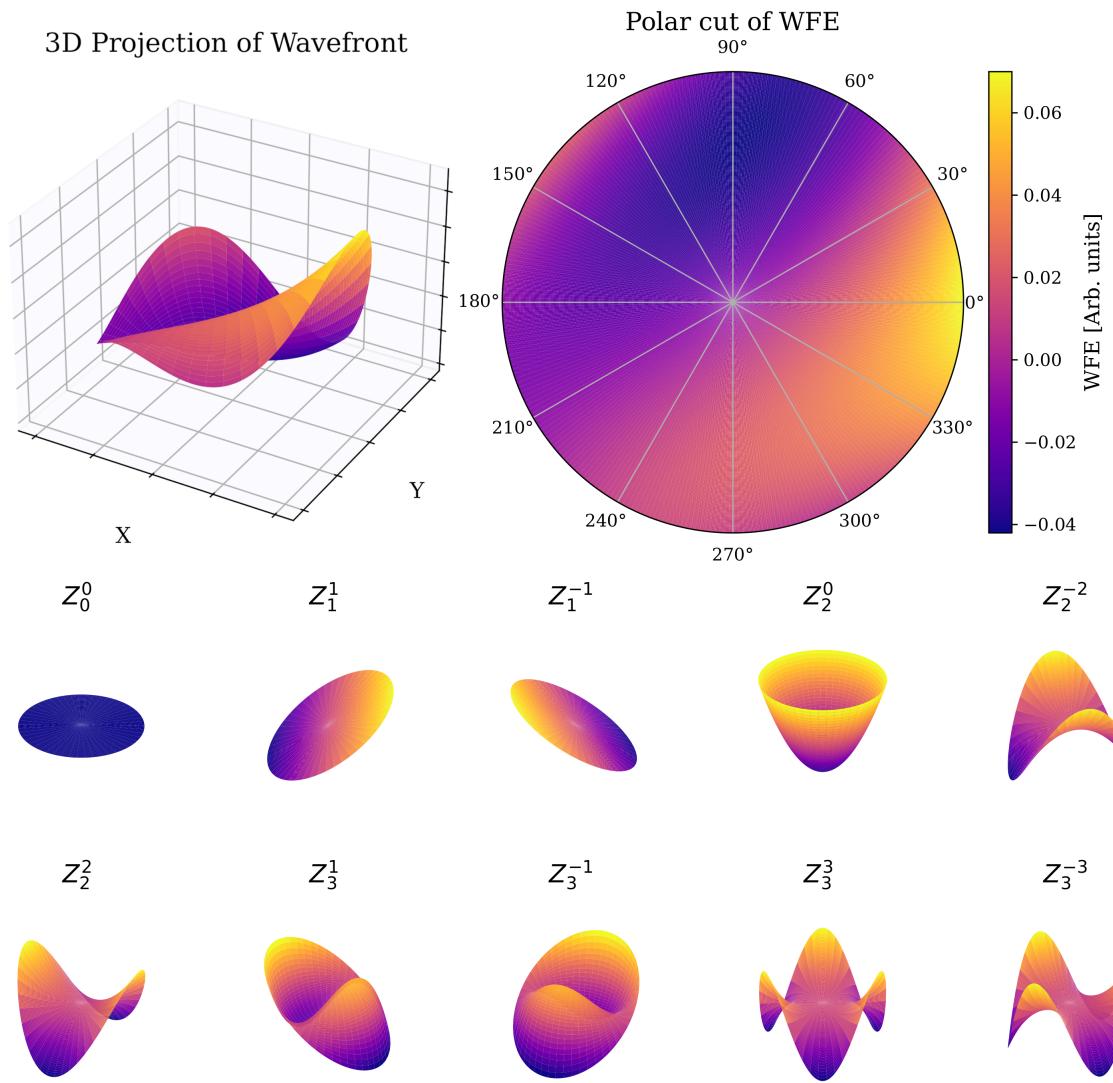


Figure 1.2 Simulation of a wavefront employing all Zernikes with  $n \leq 3$ . The top left panel shows the 3-dimensional representation of the wavefront and the top right panel shows a cut in a plane normal to the direction of travel. The bottom two rows show the shape of the individual Zernike polynomials included in the simulation.

Although properties such as the PSF and WFE offer valuable insights into the instrument's performance, they can vary between calibration phases and actual operation, or when the instrument moves from an isolated setup to integration with the full system. Therefore, instruments must have built-in methods to measure these properties during operation to evaluate performance and correct any arising defects. The strategy employed depends on the specific characteristics of the instrument. Among the different techniques, the phase diversity method is one of the most extended strategies.

The phase diversity algorithm (Childlaw et al., 1979) is a method to infer the aberrations present in an optical system by obtaining, at least, two simultaneous, or quasi-simultaneous, images of the same object where an additional and known aberration is introduced to one of the images.

The algorithm works by minimizing a merit function that depends on the OTF of the system which can be parametrized by the Zernike expansion (Paxman et al., 1992):

$$\mathcal{L}(C) = \sum_k \frac{|\hat{I}_1(\nu)\hat{S}_2(\nu, C) - \hat{I}_2(\nu)\hat{S}_1(\nu, C)|^2}{|\hat{S}_1(\nu, C)|^2 + |\hat{S}_2(\nu, C)|^2}, \quad (1.10)$$

where  $k$  represents the pairs of aberrated (subindex 1) and unaberrated (subindex 2) images,  $\hat{I}$  stands for the intensity distributions, and  $\hat{S}$  for the system's OTF expressed in terms of a Zernike expansion with coefficients  $C$ .

By finding the coefficients of the Zernike expansion that minimize  $\mathcal{L}$ , we are able to characterize the wavefront and identify the aberrations present in the optical system. Thus, determining the OTF, and consequently the PSF.

Our interest in determining the wavefront and OTF is not only to evaluate the instrument's performance but also to enable image restoration by mitigating the aberrations introduced during the imaging process. The procedure for removing the effects of the aberrations consists on removing the influence of the PSF on the final intensity distribution. In other words, the goal is to *deconvolve* the PSF from the image.

Coming back to equation (1.1), we can simplify the integrals to a convolution operator assuming an spatial invariance of the PSF. In that case, the observed intensity can be expressed by:

$$I(\xi, \eta) = O(\xi, \eta) * S(\xi, \eta) + N(\xi, \eta) \quad (1.11)$$

where we added a term accounting for the noise present in real measurements  $N(\xi, \eta)$  and  $*$  represents the convolution operator.

The treatment of the problem is easier in the Fourier domain, where the convolution operator becomes a product of the Fourier transforms of the corresponding functions. Therefore, in the Fourier domain, Eq. 1.11 becomes:

$$\hat{I}(\nu) = \hat{O}(\nu)\hat{S}(\nu) + \hat{N}(\nu). \quad (1.12)$$

Since neither  $\hat{O}(\nu)$  nor  $\hat{N}(\nu)$  are known, it is not possible to analytically derive the object, even if the system's response is known. Therefore, statistical approaches must be employed to deconvolve from PSF.

One such approach is the Wiener-Helstrom filter (Helstrom, 1967), which proposes that the estimated object,  $\tilde{O}$ , can be computed as:

$$\tilde{O}(\nu) = \frac{\hat{S}^*(\nu)\hat{I}(\nu)}{|\hat{S}(\nu)|^2 + P_N(\nu)/P_O(\nu)}, \quad (1.13)$$

where the term  $P_N(\nu)/P_O(\nu)$  represents the ratio between the power spectral densities of the noise and the object. Although this factor is unknown, it can be estimated based on the expected noise distribution in the data.

### 1.4.2 Spectroscopy

Among the tunable filtergraphs, Fabry-Pérot Interferometers (FPIs), also known as etalons (used interchangeably), represent one of the most prevalent forms of narrow-band tunable spectrographs. Composed by a resonant optical cavity formed by two distinct optical media, these devices allow only the passage of light with wavelengths corresponding to constructive interference within the cavity.

The transmission profile of an etalon, being produced by an interference phenomenon, is characterized by a series of narrow and periodic transmission peaks. The wavelengths at which these resonance peaks are located, their width, and their separation are determined solely by the physical properties of the etalon. In fact, it is not difficult to demonstrate (*e.g.*, Bailén et al. 2019a) that a resonant cavity produces a periodic transmission profile, with maxima occurring at a wavelength  $\lambda$  such that:

$$\lambda = \frac{2nd \cos \theta}{m}, \quad (1.14)$$

where  $n$  is the refractive index of the medium inside the cavity,  $d$  is the distance between the mirrors,  $\theta$  is the angle of incidence of the incoming light ray and  $m$  is the interferential order ( $m \in \mathbb{Z}$ ).

With Eq. (1.14) in mind, it is clear that an etalon allows for tuning the wavelengths of the transmission peaks by either changing the distance between the mirrors or by altering the refractive index. Although changing the angle of incidence also results in a wavelength shift, it introduces additional modifications into the profile, in addition to a spectral shift. Consequently, the angle is not used for wavelength tuning.

To isolate a single wavelength, or a narrow band surrounding it, it is necessary to employ the specific values of  $n$  or  $d$  that result in a transmission peak occurring at that wavelength, often referred to as the main order, and block the rest of interferential orders, known as secondary orders. This is typically achieved by using a pre-filter with a small bandwidth that only allows light with wavelengths near the desired measurement region to pass through.

Figure 1.3 shows a simulation of the spectral behavior of this optical setup. The order-sorting pre-filter is shown with a shaded purple area and the unaltered transmission profile of the etalon is shown in dashed lines for different values of the refractive index. In solid

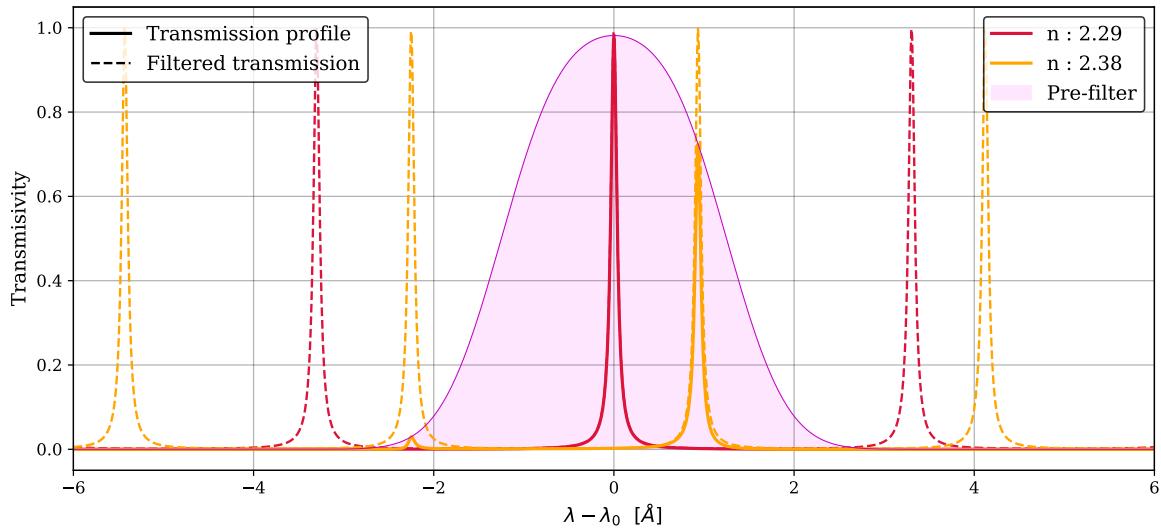


Figure 1.3 Transmission profiles of the same etalon with varying refractive indices (n). The dashed lines represent the original transmission profile, while the solid lines indicate the portion of the transmission profile that passes through the order-sorting pre-filter (shaded purple area).

lines, the resulting transmission profile is shown, that is, the transmission allowed through both the pre-filter and etalon at the same time.

### 1.4.3 Polarimetry

A polarimeter must be able to determine the Stokes components of the incoming light; however, these properties cannot be directly measured, as only the intensity of light is observed, not its intrinsic characteristics. Thus, polarimeters derive the Stokes parameters, rather than measure them. In order to do so, a series of multiple, simultaneous or quasi-simultaneous observations are taken, in which the polarization state of the incoming light is systematically altered. These different measurements, commonly referred to as modulations, are generated by inducing a known modification in the polarization. The Stokes parameters are then reconstructed by combining the information from all measurements through a process known as demodulation.

In order to understand how polarimeters derive the Stokes components we need to briefly model how the different modulations are generated. Mathematically, the effect on polarization of a linear and finite system can be treated as a combination of linear transformations on the Stokes vector and, therefore, can be represented by a matrix in  $\mathbb{R}^4$ , known as the *Mueller Matrix*. Let  $\mathbf{M}$  be the matrix that describes these transformations, then the polarization state that reaches the detector follows:

$$\mathbf{I}_{out} = \mathbf{M}\mathbf{I}_{in}, \quad (1.15)$$

where  $\mathbf{I}_{in}$  and  $\mathbf{I}_{out}$  are the Stokes vectors of the light that reaches the instrument, and the detector, respectively. However, since we only measure intensities, the actual quantities measured at the focal plane are:

$$I_{obs} = m_{00}^j I_{in} + m_{01}^j Q_{in} + m_{02}^j U_{in} + m_{03}^j V_{in} , \quad (1.16)$$

where  $m_{0i}^j$  is the i-th element of the first row of the Mueller Matrix for a modulation state  $j$ . This means that the intensity we measure is a linear combination of the different polarization states of the incoming light. To determine the values of the individual parameters  $I_{in}$ ,  $Q_{in}$ ,  $U_{in}$ , and  $V_{in}$ , further independent measurements are necessary, which can be achieved by modifying the Mueller matrix. In particular, it is easy to see that at least four independent measurements are required in order to construct a system of equations that allows us to determine the full Stokes vector. This process is known as modulation, and the four independent measurements are the different modulations.

Therefore, with these measured (observed) intensities, denoted by  $I_j$  with  $j \in \{1, 2, 3, 4\}$ , we can build a system of equations:

$$\underbrace{\begin{pmatrix} I_1 \\ I_2 \\ I_3 \\ I_4 \end{pmatrix}}_{\mathbf{O}} = \begin{pmatrix} m_{01}^1 & m_{02}^1 & m_{03}^1 & m_{04}^1 \\ m_{01}^2 & m_{02}^2 & m_{03}^2 & m_{04}^2 \\ m_{01}^3 & m_{02}^3 & m_{03}^3 & m_{04}^3 \\ m_{01}^4 & m_{02}^4 & m_{03}^4 & m_{04}^4 \end{pmatrix} \begin{pmatrix} I_{in} \\ U_{in} \\ Q_{in} \\ V_{in} \end{pmatrix} , \quad (1.17)$$

where  $\mathbf{O}$  is the so-called modulation matrix. Through straightforward algebra, it is easy to see that the Stokes vector of the incoming light can be determined from the inverse of the modulation matrix, the demodulation matrix  $\mathbf{D}$ :

$$\mathbf{I}_{obs} = \mathbf{O} \mathbf{I}_{in} \longrightarrow \mathbf{O}^{-1} \mathbf{I}_{obs} = \underbrace{\mathbf{O}^{-1} \mathbf{O}}_{\mathbb{I}} \mathbf{I}_{in} \longrightarrow \mathbf{D} \mathbf{I}_{obs} = \mathbf{I}_{in} \quad (1.18)$$

Carefully determining  $\mathbf{O}$ , and consequently  $\mathbf{D}$ , during the instrument calibration process is crucial, as the accuracy of the determination of the Stokes components depends entirely upon it. It can be proven (del Toro Iniesta & Collados, 2000) that the optimum modulation scheme—the values of  $\mathbf{D}$  that enable the Stokes vector to be computed with minimal uncertainty—satisfies the conditions:

$$\varepsilon_1 \leq 1 , \text{ and } , \sum_{i=2}^4 \varepsilon_i^2 \leq 1 , \quad (1.19)$$

where the polarimetric efficiencies for each Stokes parameter ( $i = 1, 2, 3, 4$ ),  $\varepsilon_i$ , are defined as:

$$\varepsilon_i = \left( N_p \sum_{j=1}^{N_p} D_{i,j}^2 \right)^{-1/2} , \quad (1.20)$$

where  $N_p$  is the number of independent modulations.

When designing the modulation scheme for a given instrument, it is essential to satisfy the efficiency conditions given in Eq. (1.19) to ensure optimal polarimetric accuracy for all Stokes components. Furthermore, for equal sensitivities in the measurements of Stokes parameters  $Q$ ,  $U$ , and  $V$ , the corresponding efficiencies should all be equal, with a value of  $1/\sqrt{3}$ . This is a very important result because polarimetric efficiencies are directly related to the smallest measurable polarimetric signals, the polarimetric sensitivity—essentially the inverse of the signal-to-noise ratio (S/N). This relation can be expressed as (del Toro Iniesta & Collados, 2000):

$$\left(\frac{S}{N}\right)_i = \frac{\varepsilon_i}{\varepsilon_1} \left(\frac{S}{N}\right)_1, \quad i = 2, 3, 4. \quad (1.21)$$

From Eqs. (1.21) and (1.19) it is clear that the sensitivities for computing Stokes  $Q$ ,  $U$ , and  $V$  will always be lower than that of Stokes  $I$ , as their corresponding efficiencies are smaller. To achieve an S/N of  $10^3$  in  $Q$ ,  $U$ , and  $V$  measurements, which is the sensitivity required to detect weak polarization signals, an S/N of at least  $(S/N)_0 \gtrsim 1700$  is necessary in the inference of Stokes  $I$  for a quasi-optimal modulation scheme.

Spectropolarimeters ultimately combine measurements in polarization, spectral, and spatial (image) domains. Consequently, the final observed intensity depends on all three properties simultaneously. By integrating the spectral behavior of the etalon and pre-filter with the polarimetric measurements, and taking into account the spatial dependence of these measurements, we can revisit Eq. (1.1) and rewrite it for FPI-based spectropolarimeters. In that case, the observed intensity for a modulation  $j$  at any point of the focal plane  $\eta, \xi$  when the etalon is tuned at a wavelength  $\lambda_s$  is determined by:

$$I_{obs}^j(\xi, \eta; \lambda_s) = g(\xi, \eta) \int_0^\infty T(\lambda) \iint O_j(\xi_0, \eta_0; \lambda) S(\xi_0, \eta_0; \xi, \eta; \lambda - \lambda_s) d\xi_0 d\eta_0 d\lambda, \quad (1.22)$$

where  $T(\lambda)$  accounts for the presence of the order-sorting pre-filter,  $S$  accounts for the imaging response of the instrument when the etalon is tuned at the wavelength  $\lambda_s$ ,  $g(\xi, \eta)$  represents a spatial gain factor that accounts for any wavelength independent pixel-to-pixel intensity fluctuations occurring in the focal plane, and  $O_j(\xi_0, \eta_0; \lambda)$  is the intensity distribution of the incoming light for a modulation  $j$  and is given by:

$$O_j(\xi_0, \eta_0; \lambda) = m_{00}^j I_{in}(\xi_0, \eta_0; \lambda) + m_{01}^j Q_{in}(\xi_0, \eta_0; \lambda) + m_{02}^j U_{in}(\xi_0, \eta_0; \lambda) + m_{03}^j V_{in}(\xi_0, \eta_0; \lambda) \quad (1.23)$$

#### 1.4.4 What do spectropolarimeters tell us about the Sun?

The pursuit of optimal optical performance, high polarimetric sensitivity, and the highest spectral resolution, with the minimum time span, originates from the fundamental challenge in astronomy: we cannot directly measure the properties of our objects of study. Instead, we must infer them from the only property we can observe: light. Naturally, the

more precise and comprehensive our measurements of light, the greater the wealth of information we can extract.

Inferring the properties of a light source from its polarimetric and spectroscopic features is a complex task, with computations becoming increasingly intricate as more properties are targeted for inference. This process often involves solving the radiative transfer equation (RTE), a subject that demands an extensive discussion and lies beyond the scope of this thesis. For a comprehensive exploration of this topic, we direct the interested reader to del Toro Iniesta & Ruiz Cobo (2016).

However, there are some simpler calculations we can perform with spectropolarimetric data that allow us to derive some properties of the Sun without needing to solve the RTE, if a series of conditions are met. The simplest among these is that of the line-of-sight (LOS) velocities, which can be derived from the spectral profile of emission or absorption lines. Given the spectral shift of a specific absorption or emission spectral line,  $\Delta\lambda$ , with respect to its vacuum-rest position,  $\lambda_0$ , the LOS velocities can be computed with the Doppler formula:

$$v_{\text{LOS}} = \frac{\Delta\lambda}{\lambda_0} c , \quad (1.24)$$

where  $c$  stands for the speed of light in vacuum. This relation holds if the solar feature is spatially resolved (an example of motivation for the pursuit of spatial resolution) and  $v_{\text{LOS}}$  is constant along the LOS.

The polarization of light comes into play when determining the magnetic fields. Due to Zeeman and Hanle effects, the polarity and spectroscopy of spectral lines can be altered when formed in the presence of magnetic fields. The Zeeman effect causes the spectral lines of some atomic transitions to split into multiple components. The separation and polarization state of these components depend on the magnetic field's strength and orientation. This relationship allows us to infer magnetic field properties by observing the broadening of profiles (in the weak-field regime) or the splitting of the lines, all combined with the associated polarization state.

For instance, a straightforward approach to using polarization and spectral data to derive magnetic fields is the center-of-gravity method. As outlined in Uitenbroek (2003), the line-of-sight (LOS) magnetic field strength can be determined using the following expression:

$$B_{\text{LOS}} = \frac{\lambda_+ - \lambda_-}{2} \frac{4\pi mc}{eg_L \lambda_0^2} , \quad (1.25)$$

where  $m$  and  $e$  are the electron mass and charge respectively,  $g_L$  stands for the *effective* Landé factor of the line and  $\lambda_+$  and  $\lambda_-$  are the centroids of the right and left circularly polarized line components, respectively, and are computed by:

$$\lambda_{\pm} = \frac{\int \lambda [I_{\text{cont}} - (I \pm V)] d\lambda}{\int [I_{\text{cont}} - (I \pm V)] d\lambda} , \quad (1.26)$$

where the subindex "cont" stands for the wavelength at the continuum.

Although the computations presented here are among the simplest possible, providing information only about LOS velocities and magnetic field strength, they illustrate why

spectropolarimeters, like TuMag, are often referred to as magnetographs despite measuring only light. Far more information can be extracted from the source through more advanced computations, such as determining the vector magnetic field (*i.e.*, strength, azimuth, and inclination) or surface temperature. However, as noted earlier, these are complex topics that go beyond the scope of this thesis.

## CHAPTER 2

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# SUNRISE III AND TUMAG: DESIGN AND CALIBRATION.

Observing the Sun with the highest possible quality and resolution is crucial for deepening our understanding of the physical processes governing its behavior. This necessity drives the continuous development of new state-of-the-art observatories and advanced instrumentation. Each new instrument or telescope builds upon the technical achievements of its predecessors, integrating past knowledge while introducing innovations that push the boundaries of solar observation.

An example of such advancements is the third edition of the Sunrise observatory (Korpi-Lagg et al., 2025), which marks the culmination of a collaborative effort among several international institutions. Spearheaded by the Max Planck Institute for Solar System Research (MPS) in Göttingen, Germany, the international consortium is also composed by the Spanish Space Physics Solar Consortium (S<sup>3</sup>PC), the National Astronomical Observatory of Japan (NAOJ), the Leibniz Institute for Solar Physics (KIS) in Freiburg, Germany, and the Johns Hopkins University's Applied Physics Laboratory (APL) in the United States.

Following an initial unsuccessful flight in 2022, which was aborted six hours after launch, Sunrise III was granted a second opportunity in the summer of 2024. On July 10th, 2024, at 04:22:40 UTC, the observatory was successfully launched by the Columbia Scientific Balloon facility (CSBF-NASA) from Esrange, a scientific facility operated by the Swedish Space Corporation in Kiruna, Sweden. After reaching a stable altitude of about 37.5 km, the commissioning phase began, marking the official start of the observation campaign. Observations commenced shortly thereafter and continued until the campaign concluded on July 16th at 18:20:54 UTC, when the flight was terminated.

Among the payload instruments aboard Sunrise III, TuMag holds particular significance for this thesis. The Tunable Magnetograph (TuMag; del Toro Iniesta et al. 2025), a tunable imaging spectropolarimeter developed by S<sup>3</sup>PC under the leadership of the Instituto de Astrofísica de Andalucía (IAA-CSIC) in Granada. The S<sup>3</sup>PC also includes the Instituto Nacional de Técnica Aeroespacial (INTA), the Instituto de Microgravedad Ignacio da Riva (IDR-UPM) from the Universidad Politécnica de Madrid, the Universitat de València (UV), and the Instituto de Astrofísica de Canarias (IAC). TuMag is central to this thesis, as the core of the work focuses on its calibration, operations, and data reduction processes.

In this chapter, we present an overview of the Sunrise III mission, with a particular focus on TuMag. We will first outline the scientific motivations behind its development and the design choices. This will be followed by a detailed discussion of the technical specifications of both the mission and TuMag.

## 2.1 Sunrise III

Equipped with a telescope with a one-meter aperture, two slit-based spectropolarimeters and an imaging spectropolarimeter, the Sunrise III observatory is the most complex solar telescope to ever leave the ground. The coordination of three different scientific instruments allows Sunrise to simultaneously perform narrow-band polarimetric imaging in the visible while carrying out spectropolarimetry in the near-UV and near-IR, from the advantageous point of observation at  $\sim$ 36 km of altitude leaving behind the Earth atmosphere's turbulence.

The three instruments aboard Sunrise III have been carefully designed to complement each other and address the scientific purposes of the mission. TuMag carries out high-spatial-resolution imaging spectropolarimetry in the visible range of light. Able to tune to three different spectral lines, namely the highly Zeeman-sensitive Fe I lines at 525.02 and 525.06 nm, and the Mg I  $b_2$  line, TuMag can probe the photosphere and low chromosphere quasi-simultaneously. The absence of atmosphere allows the Sunrise Spectropolarimeter and Imager (SUSI, Feller et al. 2025), developed by MPS and NAOJ, to observe in the near-UV, performing imaging and spectropolarimetry in the range of 309-417 nm. The high polarimetric sensitivity and large number of spectral lines present in this range, many of which are sensible to the Hanle effect, allows SUSI to sample many heights in the solar atmosphere at the same time while measuring the weak magnetic fields. The Sunrise Chromospheric Infrared spectro-Polarimeter (SCIP, Katsukawa 2025), co-developed by NAOJ and S<sup>3</sup>PC, also takes advantage of the absence of atmosphere and observes two of the Ca II triplets lines, and the upper photospheric K<sub>1</sub> lines close to 770nm, which are poorly accessible from ground. Spectropolarimetry measurements of these lines provides information of the 3-D structure of the chromosphere and its magnetic fields, derived thanks to the high Zeeman sensitivity of the selected lines. Furthermore, the large number of available photons at these wavelengths ensures a high S/N and polarimetric sensitivities.

The ability to probe simultaneously the near-IR, the visible and the near-UV, performing high-resolution polarimetric imaging and spectroscopy makes Sunrise III a unique observatory, capable of studying the connection and interaction of the small-scale phenomena occurring at different layers of the solar's atmosphere with unprecedented detail and completeness.

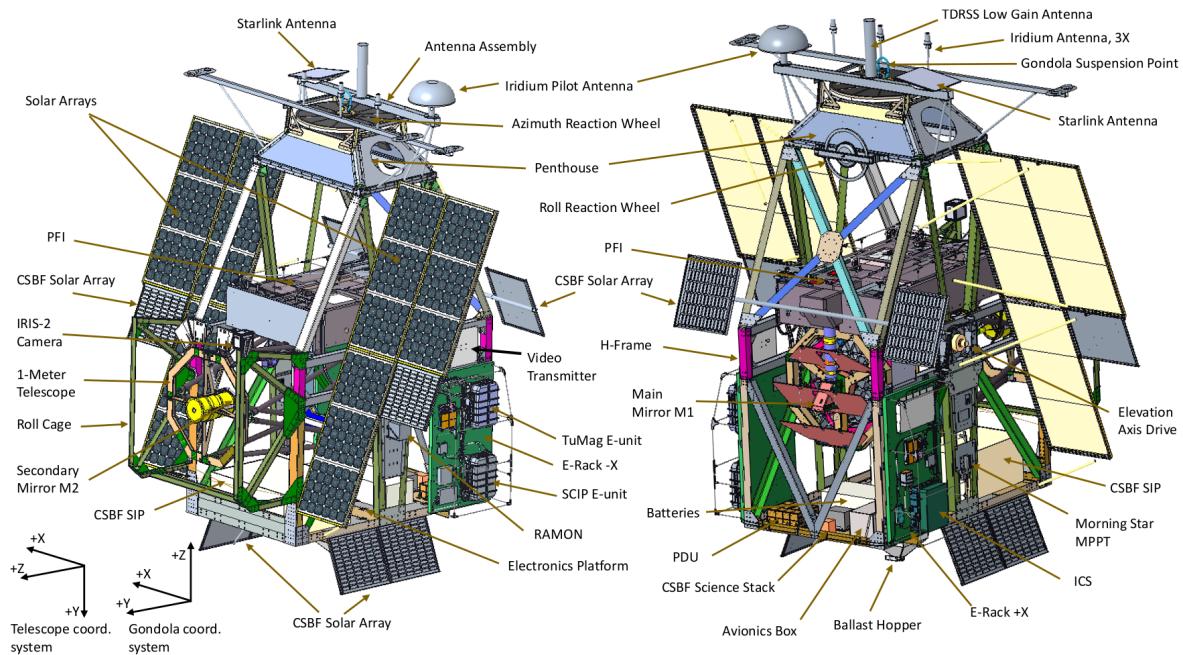


Figure 2.1 Drawing design of the Sunrise III observatory. Image reproduced from (Korpi-Lagg et al., 2025) with permission, courtesy: APL, P.Bernasconi.

### 2.1.1 Observatory's design

While the scientific instruments are central to the research performed by Sunrise, several additional subsystems play a crucial role, each contributing to the overall success of the mission.

The structural framework housing all components of the observatory, as well as the interface connecting the observatory to the flight apparatus, is provided by the gondola. This gondola, engineered by APL, is not only tasked with safeguarding the instruments and telescope during ascent and landing, but also with ensuring the stability of the pointing system. Given that the observatory is suspended from a balloon, it is subject to wind-induced motion and pendulum-like oscillations, which threaten the stability required for prolonged observations. The gondola's pointing control system (PCS) must actively counteract these disturbances in real time by making precise adjustments to the telescope's elevation and azimuth. In conjunction with the Correlating Wavefront Sensor (CWS), developed by KIS, which is responsible for image stabilization and autofocus, the full pointing system was required to achieve a pointing accuracy better than 0.005" root mean square (rms) over extended periods to facilitate long-duration observations.

The Sunrise III telescope is a Gregory-type reflector with a 1-meter aperture, featuring a 234 mm central obscuration and an effective focal length of 24.2 meters. This configuration provides a field of view (FoV) of 3.4', corresponding to approximately 150 Mm on the solar surface. The telescope directs light to the post-focus instrumentation platform (PFI), located above the telescope. The PFI houses the three scientific instruments and the CWS, and is re-

sponsible for distributing light among these four instruments. This distribution, performed by the Image Stabilization and Light Distribution Unit (ISLiD), must efficiently separate the different wavelengths in a photon-efficient manner to provide the highest number of available photons to each instrument.

While all the subsystems discussed thus far directly influence the optical performance, it is equally important to recognize the crucial role played by other subsystems, such as the electronics and software control. In particular, the Instrument Control System (ICS) is responsible for the management of the observatory, gathering housekeeping and issuing commands to the electronic units of each instrument. As will be elaborated in the following chapter, Sunrise III observations were designed to operate in a semi-autonomous manner through the use of pre-programmed timelines. This approach requires that all electronic systems function in synchrony, with minimal human intervention.

### 2.1.2 Science with Sunrise

The absence of Earth's atmosphere opens the window for simultaneous observations in the near-UV, the visible, and the near infrared, and offers a level of image stability that cannot be achieved in ground-based observatories due to atmospheric seeing. However, these advantages are also present in spaceborne missions, such as the Hinode mission (Kosugi et al., 2007) and its Solar Optical Telescope (Tsuneta et al., 2008), or the Polarimetric and Helioseismic Imager (SO/PHI; Solanki et al. 2020) aboard the Solar Orbiter mission (SO; Müller et al. 2020), among many others. Nonetheless, spaceborne missions have strong restrictions regarding payload, mass and data rate.

The absence of these restrictions in balloon-borne observatories often allows for more complex and versatile instrumentation compared to space missions and at a significantly lower budget. The combination of these two factors, namely the absence of atmosphere and the complex and advanced instrumentation they can carry, places observatories such as Sunrise in an unique position, and provides them with unique perspectives on solar phenomena.

Many aspects of the physical processes driving our Sun remain unsolved. The mechanisms underlying various solar phenomena are still the subject of debate, ranging from the origin and removal of magnetic flux in the solar photosphere to the processes responsible for heating the chromosphere and corona, as well as the small-scale dynamics of solar plasma. The three instruments aboard Sunrise work in consonance to provide novel insights into these phenomena, and aim at helping the community solve some of the open questions of solar physics. In particular, the spectropolarimetry carried out in different spectral ranges allows for the deduction of the structure of the magnetic field at different heights.

The magnetic field, present across multiple scales and heights, is the principal driver of solar activity. Understanding the magnetic field is essential for comprehending the processes that govern solar phenomena, energy distribution, and plasma dynamics. Numerous works direct their efforts to the study of the structures and evolution of magnetic fields. For instance, several works study the emergence of magnetic flux in the quiet Sun photosphere,

such as, Danilovic et al. (2010) and Guglielmino et al. (2012), where they utilized Sunrise I IMaX data to examine small-scale flux emergence events occurring at granulation scales. Likewise, the processes responsible for magnetic flux removal in the quiet Sun are not fully known. Several studies, such as Zwaan (1987) and Guglielmino et al. (2012), have proposed mechanisms for flux removal in the photosphere, such as flux cancellation due to the interaction of opposite-polarity magnetic fields, magnetic reconnection processes where field lines are rearranged or the spreading and diffusion due to granular and supergranular motions. However, no model is favoured over the other by current observations.

A thorough 3-dimensional analysis of the magnetic fields throughout the solar surface, from the quietest areas to active regions, is essential to determine how the magnetic field is structured across the solar atmosphere. The combination of spectropolarimeters and vector magnetographs aboard Sunrise, which are capable of measuring magnetic fields through the Zeeman effect, and of detecting the weakest and more turbulent (Bellot Rubio & Orozco Suárez, 2019) magnetic fields present in the solar surface using the Hanle effect - particularly in the UV - can provide a completely new perspective about how the magnetic field is structured

In addition to the study of magnetic field structures, Sunrise III aims to study the upper atmosphere, whose dynamics and heating mechanisms are not yet completely understood. In fact, the transfer of energy from the lower layers to the chromosphere and corona is one of the open problems in stellar astrophysics. Several studies propose mechanisms in which the magnetic field plays a central role in this energy transfer. Some works suggest upward currents generated by the slow motion of plasma in the photosphere as a driving mechanism (Parker 1983, Pontin & Hornig 2020), while others highlight heating processes induced by jets (Shibata et al., 2007) or magnetic vortex phenomena, such as twisted magnetic fields known as solar tornadoes (Wedemeyer-Böhm et al., 2012).

Although some observational signatures of these processes have been detected, the detailed characterization of these events requires higher spatial and temporal resolutions than those currently available. The high-cadence UV observations, where several spectral lines sensitive to the weaker magnetic fields of the chromosphere are present, combined with magnetic field maps of the photosphere and lower chromosphere provided by TuMag, and complementary observations of the Ca II infrared lines, provide Sunrise with the necessary tools to investigate these phenomena with unprecedented detail.

Sunrise will also provide novel insights into small-scale plasma dynamics. The Sun is highly dynamic, with structures evolving on timescales of minutes. Several studies propose that the magnetism in the quiet Sun is driven by the turbulent small-scale dynamics of the plasma (Petrovay & Szakaly (1993), Hotta et al. (2015), Rempel et al. (2023), among others). However, investigating these processes requires high spatial and temporal resolutions, which are often unattainable in ground-based observations. Similarly, other approaches to plasma dynamics, such as helioseismology (Gizon et al., 2010), also demand such high-resolution data. To address these challenges, Sunrise III conducted extended, highly stable due to the absence of atmospheric seeing, and uninterrupted observations lasting up to six hours, with the highest temporal resolution permitted by the S/N requirements.

In addition to these objectives, Sunrise will explore new and exciting areas, including

Requirements	Value
Field of view	63'' x 63''
RMS wavefront error	$W \sim \lambda/14$
Spatial sampling	3 × 3 pixels
Plate scale	0.0378'' / pixel
Polarimetric efficiencies	$\epsilon_{1,2,3} \lesssim \frac{1}{\sqrt{3}}$
S/N ratio	$(\frac{S}{N})_0 \gtrapprox 1700$
Spectral resolution	< 9 pm
Spectral lines	Fe I 5250.2 Å, Fe I 5250.6 Å and Mg I $b_2$ 5172.7 Å.
Time for a two-line observation	< 90 s

Table 2.1 Tumag scientific requirements.

the measurement of the polarized solar spectrum in the UV. This spectral region remains largely unexplored due to the technical challenges associated with its observation. Atmospheric absorption makes it impossible to observe this band from ground-based observatories, and it has yet to be measured by any space mission at the resolutions provided by a one meter telescope and with a high sensitive spectropolarimeter. SUSI is the first UV spectropolarimeter to acquire such high-resolution data in this wavelength range.

## 2.2 The Tunable Magnetograph: TuMag

TuMag is an FPI-based tunable imaging spectropolarimeter, capable of measuring the full Stokes vector across various spectral lines. This tunability allows TuMag to probe the magnetic field in both the photosphere and lower chromosphere, with high resolving power, thanks to its near-diffraction-limited imaging capabilities. The design of TuMag is inherited from IMaX, the imaging spectropolarimeter that flew aboard previous Sunrise missions. However, TuMag incorporates several advancements over its predecessor, including the addition of filter wheels for tunability between three different spectral lines and the ability to introduce several calibration targets to the observations, along with newly designed cameras and modulation packages.

In this section, we present an overview of the design of TuMag and its performance. It is important to note that this discussion will primarily focus on the instrument's optical performance—specifically its polarimetric, spectral, and imaging properties. Other aspects, such as the thermal behaviour, the electronics or the control software, among others, while crucial to the instrument's functionality, will not be covered here to avoid excessive length. Many of these aspects can be found in the TuMag paper (del Toro Iniesta et al., 2025).

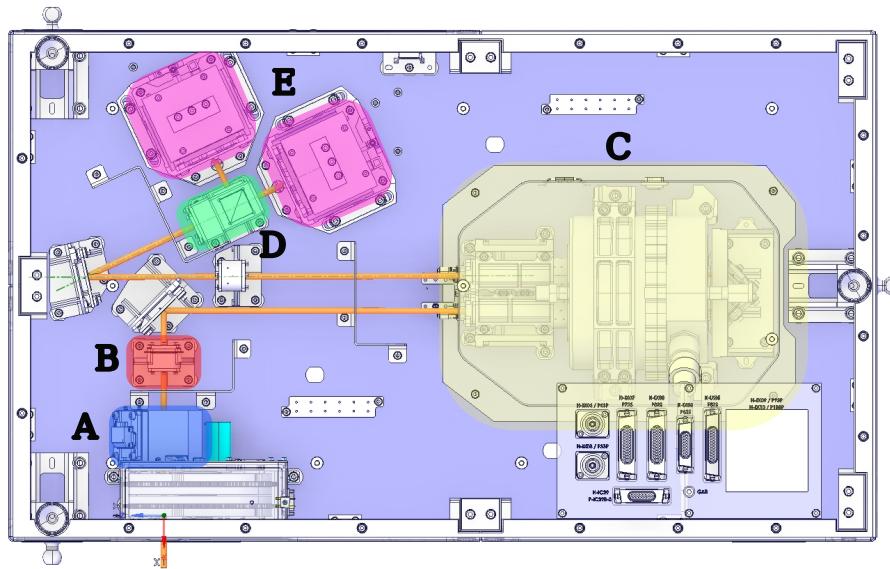


Figure 2.2 Schematic representation of the TuMag instrument. Some relevant optical devices in the light path (yellow line) are highlighted with a colored box and labeled with letters from A to E: A) Filter wheel, B) PMP, C) Etalon oven, D) beam-splitter and E) cameras. Image taken from del Toro Iniesta et al. (2025), reproduced with permission.

### 2.2.1 TuMag's design and light path.

As a polarimeter, TuMag must be able to measure the full Stokes vector of the incoming light. To achieve this, it must generate four distinct modulation states and measure them in an almost simultaneously manner. As a spectrometer, TuMag must possess the capability to select specific wavelengths along multiple spectral lines. This selection process involves, first filtering the light with a pre-filter, which selects a "broad" spectral range, followed by an etalon that further narrows the bandpass within the selected range. Throughout this procedure, stringent requirements regarding polarimetric sensitivity (efficiency), spectral resolution, and imaging quality must be maintained. A summary of these requirements is presented in Table 2.1.

Light is delivered to TuMag by the ISLiD system and subsequently re-imaged onto two cameras where the images are recorded. Before reaching the cameras, the light passes through all the different subsystems of the optical unit. The first components encountered by the light are a blocking prefilter and the filter wheel (box A in Fig. 2.2). The blocking prefilter, with a wide bandpass centered at 520 nm, is employed to eliminate unwanted spectral ranges. The filter wheel is comprised by a double-disk system (Sánchez et al., 2022) that houses the prefilters for selecting specific spectral lines and a series of calibration targets. Specifically, the first disk carries a linear polarizer, a plate of micropolarizers a pinhole set and a PD plate. The second disk hosts the three pre-filters, corresponding to the spectral lines Fe I 5250.2 Å, Fe I 5250.6 Å, and Mg I  $b_2$  5172.7 Å, in addition to a dummy target that can be employed to allow all spectral ranges to enter the instrument.

After passing through the filter wheels, the light is directed into the Polarization Modulation Package (PMP) (Álvarez-Herrero et al., 2018a), highlighted with the red box in Fig.2.2. The PMP’s primary function is to modulate the light to produce the different polarization states required to deduce the Stokes components. This is achieved using two liquid crystal variable retarders (LCVRs), which are oriented with their fast axes at 45° relative to each other. These LCVRs induce a retardance on the transmitted light that varies with the voltage applied across the crystals. The system can operate in two distinct modulation schemes: a vector modulation scheme, which generates four independent linear combinations of, ideally, equally-weighted Stokes components across consecutive observations, allowing for the retrieval of the full Stokes vector after demodulation; and a longitudinal modulation scheme, which generates only two modulations, providing information solely on the intensity and circular polarization.

Following modulation, the light is directed into a LiNbO<sub>3</sub> Fabry-Pérot etalon, highlighted in yellow in Fig.2.2 (box C). Likewise IMaX, the etalon operates in a collimated setup and with a double pass configuration (Álvarez-Herrero et al., 2006). In this configuration, after the light passes through the etalon once, it is redirected by a pair of mirrors to pass through the etalon a second time. This double-pass configuration significantly enhances spectral resolution by narrowing the transmission profile. The LiNbO<sub>3</sub> etalon tunes the resonance wavelength by varying the refractive index of the cavity through the application of high voltages (ranging from -4000 V to 4000 V). Compared to air-gapped etalons, these kind of etalons offer the advantage of having no moving parts, which is particularly beneficial for spaceborne or balloon-borne instruments. However, this advantage comes with the need for precautions to prevent discharges caused by air ionization.

The final optical element the light encounters before reaching the cameras is a polarizing beam splitter (green box C in Fig.2.2). At this stage, the light beam is divided into two orthogonal, linearly polarized components, each directed towards a different camera. This dual-beam configuration (Lites, 1987) is designed to minimize spurious signals induced by jitter of the gondola (see del Toro Iniesta 2003 for an extended discussion), as it effectively cancels fluctuations from Stokes I to the other Stokes parameters that may arise due to image motion or solar evolution (*i.e.*, cross-talk).

Light then reaches the two custom-made cameras (boxes E; Orozco Suárez et al. 2023 equipped with GPIXEL back-illuminated GSENSE400BSI detectors, each featuring a 2k × 2k pixel array, and specifically designed to meet TuMag’s scientific requirements. These cameras accomodate a FoV of 63'' × 63'', sufficient to encompass an entire medium-sized active region, with a plate scale of 0.0378''/pixel.

After mission recovery, the data are processed on-ground to combine images from the different cameras, modulation states, and spectral lines, ultimately deriving the scientific products. This processing and reduction of the data is accomplished using software specifically developed for TuMag, which will be extensively discussed in Chapter 3.

## 2.2.2 Instrument performance and verification.

To ensure data quality, TuMag underwent multiple verification and calibration processes, during which its spectral, polarimetric, and imaging properties were meticulously tested. These procedures, commonly referred to as end-to-end (E2E) calibration tests (see Álvarez Herero et al. (2022) for a detailed description of the tests), were conducted at various stages during the development of TuMag. Specifically, they were performed during the assembly, integration, and verification (AIV) activities with the stand-alone instrument at INTA facilities in Madrid, Spain; during the AIV phase of the PFI platform at MPS facilities in Göttingen, Germany; and during the TuMag AIV phase in the Sunrise III mission at ES-RANGE facilities in Kiruna, Sweden. These tests were designed not only to validate the instrument’s capabilities but also to measure critical parameters such as the tuning constant of the etalon, modulation matrices, and best-focus position—each of which is vital for the optimal operation of TuMag and the subsequent data processing. We will now delve into the details of the imaging, spectral and polarimetric properties of the instrument as well as the verification processes and results.

### 2.2.2.1 Imaging performance.

The imaging E2E tests involved projecting several targets at the F4 focus, including a USAF test target, star targets, and a grid, observed both with and without the phase diversity (PD) plate. These targets were utilized to evaluate the MTF and to assess the resolving power of TuMag. The PD measurements enabled verification of the wavefront error (WFE) derived from the MTF and an evaluation of the image quality following image restoration.

The USAF target<sup>\*</sup> consists on a series of horizontal and vertical line pairs (lp) arranged in sets of three with varying resolutions. Identifying the highest resolution group observable with TuMag allows for a fast diagnostic of the instrument resolution and performance. In Fig. 2.3, measurements of group 4 and 5 (and higher) of the USAF target are shown for both cameras and the three pre-filters. The second set of group 5 (highlighted in a white box), which corresponds to 35.9 lp/mm in the target and 24.3 lp/mm in the image, is of special interest since its close to the Airy disk radius (26.4 lp/mm) and therefore close to TuMag’s resolution limit.

The results show a better optical performance for the 517 nm pre-filter than the other two pre-filters. The USAF 5.2 set is clearly resolved for this pre-filter in both cameras showing almost no difference between vertical and horizontal resolutions. However, results for the 525 nm prefilters exhibit a worsening of the resolution, with the same set being hardly resolved in the horizontal direction in both prefilters.

However, a more precise evaluation of the optical performance can be achieved from the MTFs. Figure 2.4 shows the MTFs computed with a slit target (see Huang et al. (2013) for a description of the MTF computation method) during the E2E tests performed in December 2021 at INTA facilities. These results agree with the diagnostic carried with the USAF tests: the 517 nm pre-filter shows a good performance in both directions, with values above the

<sup>\*</sup>The 1951 USAF target from Thorlabs Inc, model: R1DS1N.

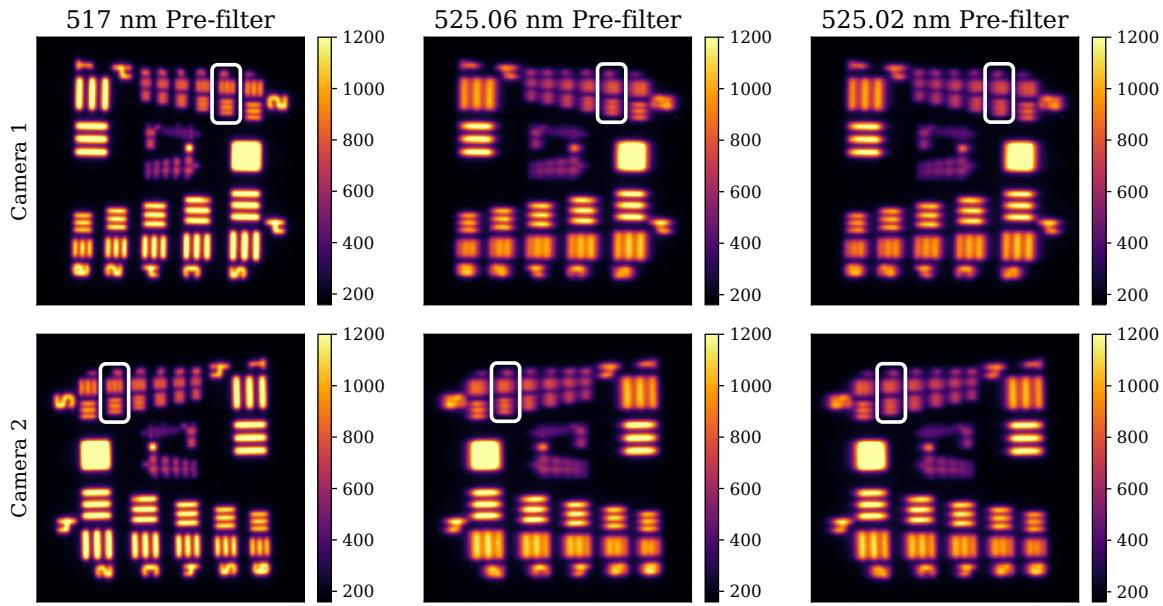


Figure 2.3 USAF target measurements for both cameras and the three pre-filters performed during E2E tests at INTA facilities on December 2021. The white boxes highlight the second element of the test group 5 (35.9 lp/mm). The scale of the images is set in digital counts.

expected behaviour. Meanwhile, 525 pre-filters exhibit a large difference between different directions with an important drop in vertical resolution in both cases. This observed astigmatism is attributed to the etalon and physical deformations of the pre-filters caused by the mechanical method used to secure and tilt them. This effect is particularly noticeable in the iron pre-filters due to the higher angles of incidence required for their tuning.

The comparison of the obtained MTF and the diffraction-limited one allows for an estimation of the Strehl ratio, and consequently the wavefront error (see section 1.4.1).

Table 2.2 shows the results for the Strehl ratios and  $W_{\text{rms}}$  derived from this computation. All values, except for the horizontal resolution in camera 1 of the 517 nm prefilter are lower than the  $\lambda/14$  set as a requirement. However, in order to enhance the optical performance of the instrument, TuMag is equipped with a PD plate in the filter wheel that allows for the assessment of the PSF during the observations to apply image restoration techniques during the data processing. Through this reconstruction, the images can remove the additional aberrations introduced by the telescope, the image stabilization and light distribution (ISLiD) system and uncorrected jittering. Images can always be restored if  $W_{\text{rms}} \gtrsim \lambda/5$  (Vargas Dominguez, 2009) if the PSF is known. Furthermore, PD techniques not only allow us to enhance the optical performance of the instrument but also evaluate the optical performance during the calibrations in order to verify the results obtained through the computation of the MTF.

Figure 2.5 shows the measurements and results of the PD analysis for the 517 nm pre-filter and the camera 1. The measurements were carried out during the final E2E tests performed at Kiruna on April 2024 using the random dot target (left and central columns of

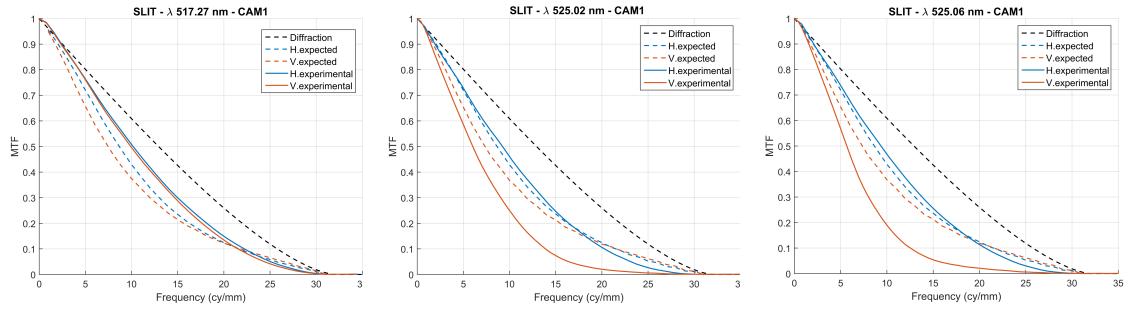


Figure 2.4 MTFs derived for camera 1 (very similar results for camera 2) for the three pre-filters from measurements of the stand-alone AIV phase performed at INTA in December 2021. Image taken from (del Toro Iniesta et al., 2025), reproduced with permission. Analysis performed by INTA.

Pre-filter and camera	Strehl ratio Vertical	Strehl ratio Horizontal	$W_{\text{rms}}$ Vertical	$W_{\text{rms}}$ Horizontal
517 nm - Cam 1	0.782	0.826	$\lambda/12.7$	$\lambda/14.5$
517 nm - Cam 2	0.761	0.806	$\lambda/12.1$	$\lambda/13.5$
525.02 nm - Cam 1	0.436	0.725	$\lambda/6.9$	$\lambda/11.1$
525.02 nm - Cam 2	0.405	0.726	$\lambda/6.6$	$\lambda/11.1$
525.06 nm - Cam 1	0.451	0.764	$\lambda/7$	$\lambda/12.1$
525.06 nm - Cam 2	0.444	0.736	$\lambda/7$	$\lambda/11.3$

Table 2.2 Optical performance evaluated from the MTFs obtained with the slit target at December 2021 E2E tests. Results taken from (Álvarez Herrero et al., 2022).

the figure). The measurements consist on 5 sets of focused-defocused pairs of images. The PD algorithm is run over a zoomed-in region of 600 pixels in sub-patches of 128x128 pixels. The mean Zernike coefficients are shown in the top right panel, where the error has been computed as the standard deviation between different sub-patches. A 2D representation of the  $W_{\text{rms}}$  is also shown in the bottom right panel.

The PD analysis indicates a small amplitude for most aberrations, with coefficients beyond  $Z_{15}$  approaching zero, except for the spherical aberration ( $Z_{11}, Z_4^0$ ) which is the dominant contribution to the  $W_{\text{rms}}$ . However, the results exhibit significant dispersion, as reflected by error bars that reach values up to  $0.025\lambda$  for the first coefficients. Both the defocus and astigmatism are low (Zernike indexes 4, 5 and 6,  $Z_2^0, Z_2^{-2}$  and  $Z_2^2$ , respectively), agreeing with the results obtained from the MTF analysis which showed a good resolution in both vertical and horizontal directions. The overall  $W_{\text{rms}}$  obtained from this analysis is  $\lambda/11.4$ . It is important to note that the PD analysis shown here was carried out at the final stages of the calibration campaign, with TuMag mounted on the PFI with the light being fed to the instrument through the telescope and ISLiD system, whereas the MTF determination was conducted in the stand-alone AIV phase, without the aberrations introduced by these systems. Nevertheless, both analyses agree on a WFE better than  $\lambda/10$ , indicating

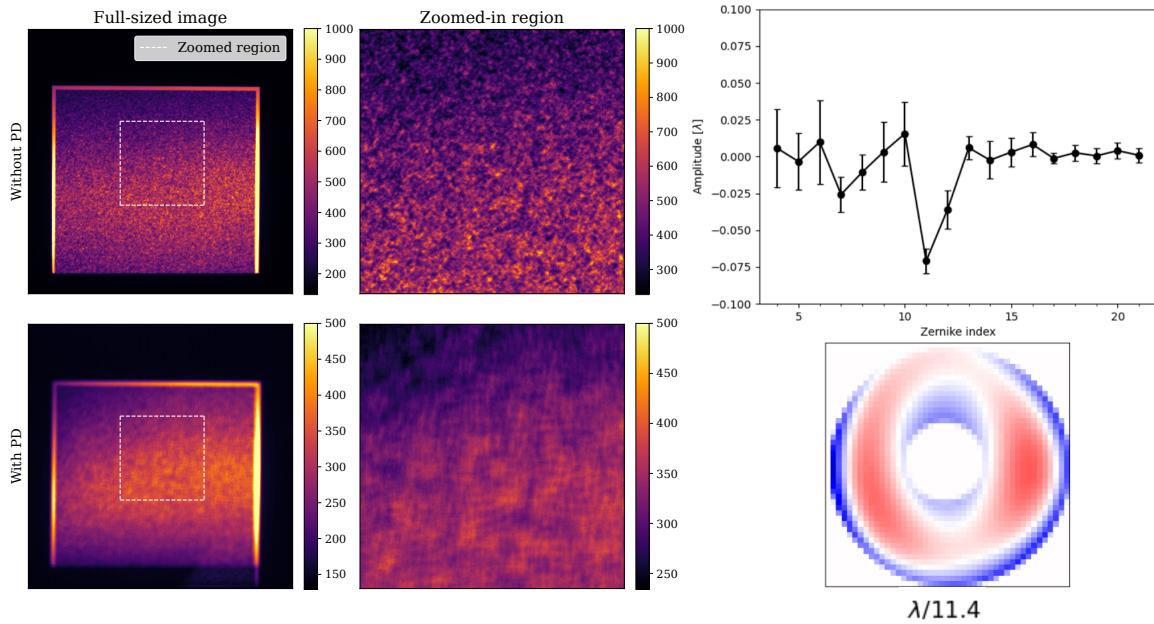


Figure 2.5 Random dot target measurements of the 517 nm pre-filter with the camera 1 and without the PD plate (left and central columns) taken during the Sunrise III AIV phase in Kiruna on April 2024. The right column shows the Zernike coefficients obtained from the PD analysis in the top panel and the 2D representation of the  $W_{\text{rms}}$ . The PD analysis has been carried out by F. J. Bailén, reproduced with permission.

very high optical quality, despite the fact that the FPI of TuMag operates in a collimated configuration, which is known to degrade optical performance (Scharmer, 2006).

### 2.2.2.2 Spectral performance.

TuMag is fed with an already spectrally-filtered light where the unwanted regions of the solar spectrum are eliminated. Then, the instrument filters the wavelengths a second time employing a second narrow-band pre-filter that is tuned to the three selected spectral lines. Finally, the LiNbO<sub>3</sub> Fabry-Pérot etalon is in charge of selecting a very narrow band around specific wavelengths along the spectral lines. The narrow-band pre-filter and the etalon are critical to TuMag's spectroscopic performance and require careful evaluation during calibration.

The three TuMag pre-filters were custom-manufactured by Materion<sup>TM</sup> and have a full width at half maximum (FWHM) close to 1 nm. They are centered near the rest wavelength of the three spectral lines at normal incidence, with a peak transmission exceeding 80% in all cases. Each pre-filter was tuned by adjusting the incidence angle to align the peak transmission wavelength with the spectral line rest wavelength. This process was performed using a coelostat at the INTA facilities, where the rest positions in volts of the spectral lines were determined. The Fe I 5250.2 Å line was found at 2129 V, the Fe I 5250.6 Å line at -2507 V, and the Mg I  $b_2$  5172.7 Å line at -2245 V. While this tuning was successful,

Property	Value
Reflectivity	0.892
Thickness	281 $\mu\text{m}$
FWHM (double-pass)	0.87 mÅ
Tuning Constant	3300 V/Å

Table 2.3 Tumag Fabry-Pérot specifications. The FWHM has been computed from the theoretical transmission profile of a collimated etalon with the reflectivity, and thickness provided in this table. See section 4.1.1 for details in the analytical model of FPIs.

particularly for the iron lines, the spectral position of the pre-filters was found to be highly sensitive to illumination conditions. This sensitivity was evident from the shifts observed in the pre-filter measurements during the various stages of the assembly process. As illustrated in the left column of Fig. 2.6, the variation in the spectral position of the pre-filters is not sufficient to cause the spectral line to be blocked by the pre-filter, but it may result in the spectral line falling on the wing of the pre-filter during observations.

TuMag etalon (see Table 2.3) operates in a collimated setup with a transmission profile with a FWHM of 0.87 pm (in the double-pass configuration), thus achieving a spectral resolution that exceeds the required 9 pm. Observations of a iodine cell illuminated with a diode were conducted to verify the transmission profile's shape and accurately assess the tuning constant. The right column of Fig. 2.6 presents, in orange, the iodine cell measurements obtained during the assembly, integration, and verification (AIV) phase of TuMag's integration into the PFI platform, which took place at the Max Planck Institute for Solar System Research (MPS) in Göttingen, Germany, in November 2023. Additionally, the dark blue line in the figure represents a simulation of the iodine spectrum observations. This simulation was generated using an analytical model of the transmission profile of collimated etalons (see section 4.1.1 for a detailed overview of the model). The results confirm that the spectral resolution achieved in the iodine cell observations is consistent with the estimated 0.87 pm resolution. Furthermore, these observations enabled the calculation of the etalon's tuning constant by identifying the corresponding line cores between the simulation and observation and applying a least squares fitting to establish the relationship, which was measured in 3300 V/Å.

An observation of the solar spectrum with the 517 nm pre-filter, conducted at INTA facilities in December 2021 during the end-to-end calibration tests, is presented in Fig. 2.7, along with the corresponding pre-filter measurement. The magnesium line core is detected at approximately -2200 V using the primary order of the etalon and reappears around 3750 V with a secondary order. The solar spectrum<sup>†</sup> is shown twice, with the magnesium core fitted to both orders. These results reveal significant contamination from the secondary order near the pre-filter's minimum transmittance. At around 0 volts, the observed spectrum (orange line) is a composite of contributions from both the primary (red line) and secondary (green line) orders, where the transmittance is diminished due to the presence of a solar line observed through the second order. The removal of this contribution is one

<sup>†</sup>Taken from the Kitt Peak FTS-Spectral-Atlas (Brault & Neckel, 1987)

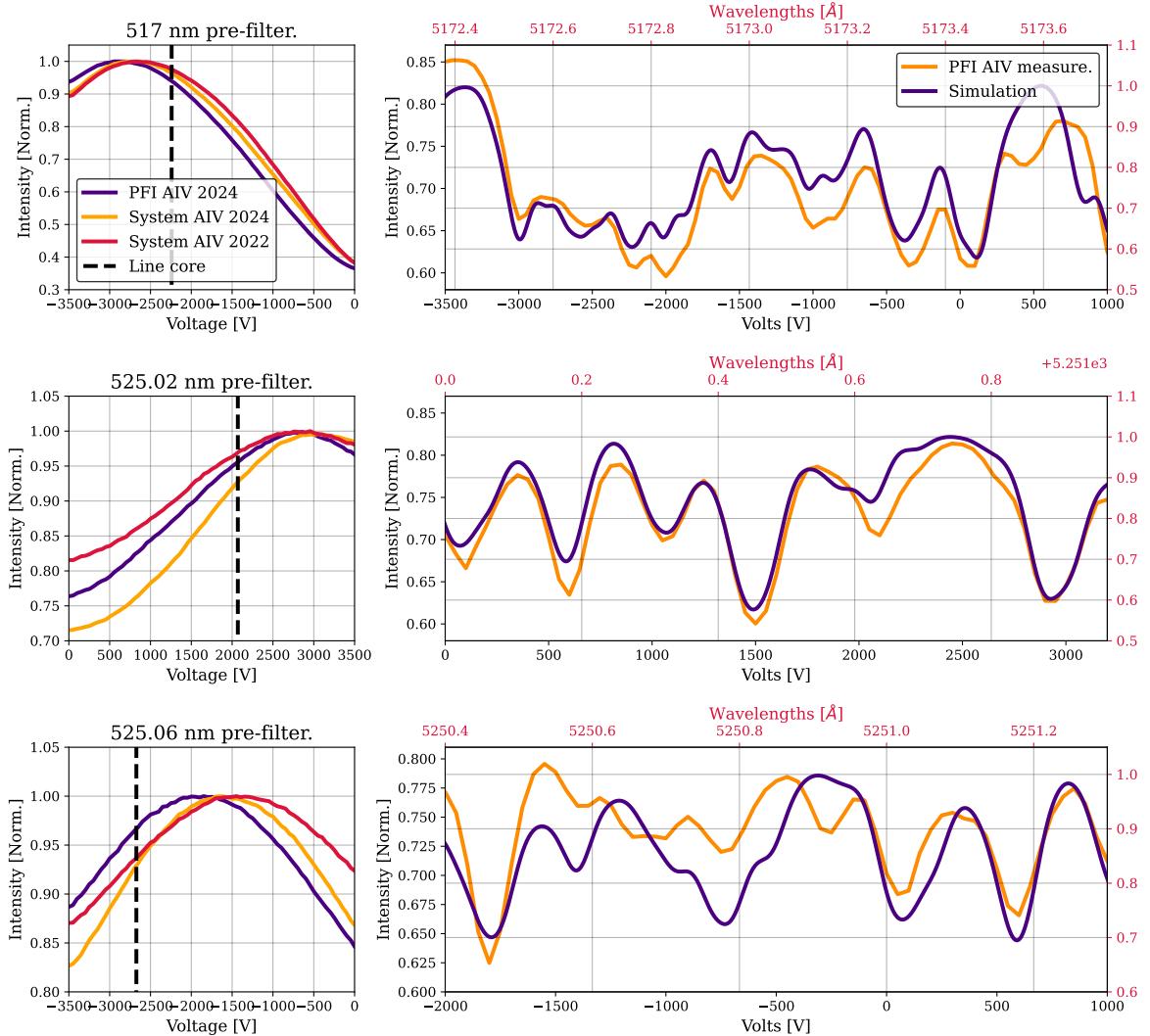


Figure 2.6 TuMag spectroscopic calibration results. Each row shows results for the 517 nm, 525.02 nm and 525.06 nm pre-filters, from top to row. The left column shows measurements of the pre-filters carried out with a flat LED on different stages of the AIV phases. The right column shows the fit of the  $I_2$  cell observation with a simulation employing an etalon with a reflectivity of 0.892 (FWHM  $\sim 0.87$ ). Note that the absolute value of the wavelengths of the simulation (red axis) might be shifted with respect to real values due to unknown conditions of the reference.

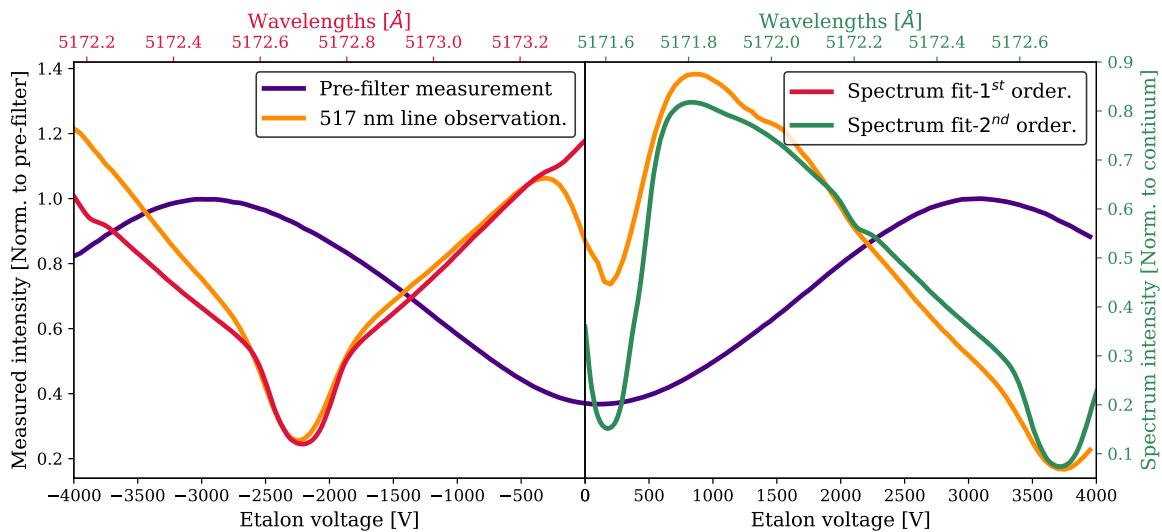


Figure 2.7 Results of the spectroscopic calibration during the end-to-end calibrations of the AIV phase of 2021. The dark blue curve represents the measurement of the 517 nm pre-filter, alongside an observation of the magnesium line using the coelostat at INTA facilities, shown in orange. Two different fits of the solar spectrum are overplotted on the figure. The red line represents a fit to the primary etalon order (negative voltages), while the green line corresponds to a fit to the second etalon order (positive voltages).

of the steps to be performed by the data correction pipeline. This contamination is particularly relevant for data processing, as continuum measurements of the magnesium line are typically conducted at -80 V. The broader profile of the magnesium line necessitates continuum measurements farther from the line core, making it more susceptible to this contamination. In contrast, the narrower iron lines do not require such extensive offsets for continuum measurements and are thus less affected.

### 2.2.2.3 Polarimetric performance.

TuMag modulates the incoming light through a PMP composed of two LCVRs. These devices can modify the phase retardance induced to the light that goes through them by changing the alignment of their molecules when subject to a voltage. Their advantages for airborne instruments lie in their lightweight and compact design, the low voltage required for operation ( $[0 - 10]$  V), and their efficiency in producing either four linearly independent modulation states for full-Stokes polarimetry or only two states for measuring the longitudinal component of the magnetic field through Stokes V. This versatility is a specific advantage of LCVRs, not found in quarter-waveplate-based PMPs (Martinez Pillet et al., 2004).

TuMag's polarimetric measurement approach is divided into the two modulation schemes already mentioned: vectorial and longitudinal. In the vectorial scheme, four linearly independent modulation states are generated in rapid succession by the PMP, enabling the

Spectral lines	Modulation	Vectorial				Longitudinal	
		I1	I2	I3	I4	I1	I2
525 & 517 nm	LCVR1 retardance	225°	225	315°	315°	180°	180°
525 & 517 nm	LCVR2 retardance	234.74°	125.26°	54.74°	305.26°	90°	270°
525 nm	LCVR1 voltage	2.291	2.533	1.992	1.947	2.761	2.761
	LCVR2 voltage	2.375	3.360	6.433	2.016	4.723	2.186
517 nm	LCVR1 voltage	2.343	2.580	2.031	1.972	2.797	2.797
	LCVR2 voltage	2.371	3.416	6.548	2.051	4.77	2.206

Table 2.4 Tumag LCVR retardances and corresponding voltages for both modulation schemes and the three pre-filters. Note that a single value is provided for both iron pre-filters.

calculation of the full Stokes vector. Conversely, the longitudinal approach generates only two modulation states, providing information on just two components. This modulation is designed to compute Stokes V by determining the quantities  $I \pm V$ .

Both modulation schemes are required to operate under an optimal modulation scheme. Such a scheme is defined by a modulation matrix with the following polarimetric efficiencies:  $\varepsilon_{opt} \geq [1, \frac{1}{\sqrt{3}}, \frac{1}{\sqrt{3}}, \frac{1}{\sqrt{3}}]$ . The selected modulation scheme was based on the retardances outlined in Table 2.4. A thorough calibration of the liquid crystal variable retarders (LCVRs) was conducted to accurately determine the voltages necessary to produce the specified retardances (Álvarez-Herrero et al., 2018b).

Considerations on the (S/N) are critical for ensuring the required polarimetric sensitivity. Achieving a S/N of  $10^3$  in the Stokes measurements imposes a requirement of  $S/N \approx 1300$  for each modulation measurement per camera. This calculation assumes near-optimal polarimetric performance, and takes into account the dual-beam polarimetry technique, which increases the S/N by a factor of  $\sqrt{2}$  when combining data from the two cameras. A single shot of the cameras is insufficient to reach these S/N values, as the sensors do not have enough capacity in their electron wells. To address this, multiple exposures are captured and subsequently summed during each observation. This *accumulation* strategy, extensively tested and employed in various polarimeters (e.g., Elmore et al. 1992, Martínez Pillet et al. 1999, Lites et al. 2001), has proven compatible with image reconstruction techniques (González & Kneer, 2008; Van Noort & van der Voort, 2008). It allows for adjusting S/N levels depending on the scientific objectives of the observation, balancing between velocity and polarimetric sensitivity.

However, in order to fulfill the polarimetric sensitivity requirements, the modulation matrix of the instrument must be carefully addressed during the polarimetric calibrations. Any deviation in the computation of the modulation matrix, will introduce spurious signals in the polarization measurements, known as cross-talk. The polarimetric calibration involves a series of measurements using a light beam with a known polarization state, generated by a rotating linear polarizer and a rotating quarter-waveplate. By varying the positions of these two devices, 40 different input polarization states were produced and measured with three pre-filters. These measurements allowed for the precise determina-

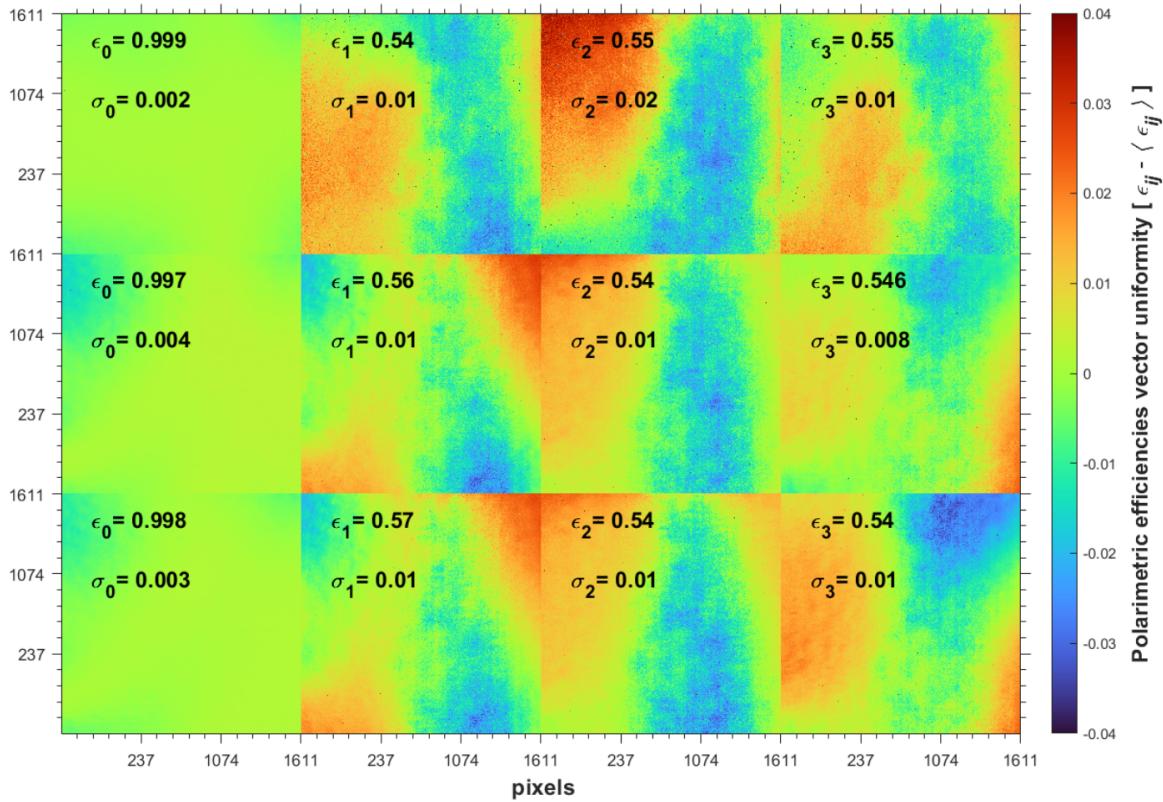


Figure 2.8 Polarimetric efficiencies for camera 1 and the three pre-filters (from top to bottom, the different rows show the results for 517 nm, 525.02 nm, and 525.06 nm). The different columns correspond to the efficiencies of the different Stokes components. The colormap measures the differences in efficiencies along the FoV. Results obtained during the E2E tests performed at INTA in December 2021, during the stand-alone AIV phase. Figure taken from (del Toro Iniesta et al., 2025), reproduced with permission. Analysis performed by INTA.

tion of the modulation matrix by solving the system of equations (1.17), where the only unknown is the modulation matrix  $\mathbf{O}$ , as both the measured modulations and the Stokes components of the incoming light are known. The modulation matrices for both cameras (indicated through the subindex) and all pre-filters that were determined through this process during the polarimetric E2E tests conducted at the Sunrise III AIV phase in Kiruna,

Sweden, in 2022, are:

$$M_0^{517} = \begin{bmatrix} 0.951 & -0.612 & 0.474 & 0.459 \\ 0.955 & -0.331 & -0.758 & -0.382 \\ 1.058 & 0.456 & 0.562 & -0.712 \\ 1.036 & 0.747 & -0.260 & 0.600 \end{bmatrix} \quad M_1^{517} = \begin{bmatrix} 1.054 & 0.763 & -0.394 & -0.524 \\ 1.036 & 0.497 & 0.793 & 0.306 \\ 0.953 & -0.282 & -0.475 & 0.683 \\ 0.958 & -0.585 & 0.320 & -0.613 \end{bmatrix}$$

$$M_0^{525.02} = \begin{bmatrix} 0.954 & -0.694 & 0.406 & 0.414 \\ 0.969 & -0.390 & -0.803 & -0.368 \\ 1.042 & 0.418 & 0.495 & -0.705 \\ 1.035 & 0.710 & -0.266 & 0.612 \end{bmatrix} \quad M_1^{525.02} = \begin{bmatrix} 1.059 & 0.771 & -0.449 & -0.433 \\ 1.024 & 0.449 & 0.723 & 0.335 \\ 0.965 & -0.344 & -0.543 & 0.650 \\ 0.953 & -0.606 & 0.191 & -0.641 \end{bmatrix}$$

$$M_0^{525.06} = \begin{bmatrix} 0.951 & -0.687 & 0.403 & 0.424 \\ 0.962 & -0.373 & -0.800 & -0.339 \\ 1.048 & 0.415 & 0.500 & -0.728 \\ 1.038 & 0.736 & -0.236 & 0.601 \end{bmatrix} \quad M_1^{525.06} = \begin{bmatrix} 1.060 & 0.777 & -0.403 & -0.463 \\ 1.032 & 0.471 & 0.754 & 0.290 \\ 0.960 & -0.306 & -0.497 & 0.681 \\ 0.948 & -0.620 & 0.205 & -0.619 \end{bmatrix}$$

The results of the polarimetric calibration performed during the end-to-end (E2E) tests at INTA in December 2021 are presented in Fig. 2.8. The figure shows the results for camera one; however, camera two demonstrated nearly identical efficiencies. The polarimetric efficiencies across the entire field of view (FoV) exceed the required thresholds  $\varepsilon_{req} \geq [0.95, 0.45, 0.45, 0.45]$ , and approach the optimal values. Furthermore, efficiency variations along the FoV are generally low, with standard deviations lower than 0.01. This homogeneity of the polarimetric performance should make the data reduction easier as no special treatment is required for specific regions.

## CHAPTER 3

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### TUMAG'S PIPELINE AND DATA.

The 2024 observational campaign of the third edition of the Sunrise observatory took place between the 11<sup>th</sup> and 17<sup>th</sup> of July and was an outstanding success. In contrast to previous flights, where technical challenges limited the number of useful observations, all subsystems performed exceptionally well during this third flight, allowing for nearly continuous instrument operation over more than six days. From TuMag's perspective, the campaign yielded approximately 10 terabytes of data, consisting of over 40 scientific observation blocks and 250 calibration observations.

The substantial volume of data generation by the three instruments, requires that the data must be physically recovered on-site after flight termination, since they cannot be broadcasted from the observatory to the operations center. Recovery activities began immediately after landing and lasted until early August, during which all surviving components, along with the data vaults, were transported to Yellowknife, Canada, the nearest city to the landing site. The data vaults arrived at MPS in early August, where a backup was created before the data associated with each instrument was sent to the respective IP institution. TuMag's data arrived at IAA in late August, marking the official start of the reduction process.

The reduction process began by labeling all images and identifying the more than 600 thousand images captured by TuMag. Once the observations were correctly identified, the reduction process commenced and, at the time of writing, remains ongoing. Due to the relevance of the pipeline development and results for this thesis, this chapter will provide an overview of TuMag's data and the current state of its pipeline, although the results remain preliminary.

The discussion will begin by introducing TuMag's various observing modes, both scientific and calibration, followed by a brief review of the observation campaign, outlining the different observation programs and their scientific objectives. The chapter will conclude with an examination of the data reduction process, detailing the pipeline and presenting some initial results. It is important to note that, due to the late arrival of the data, this thesis had to be written in parallel with the reduction process. Therefore, the results presented here are preliminary, and the final product will differ as additional reduction steps are incorporated.

Observing mode	Spectral lines	$N_\lambda$	$N_P$	$N_a$	$N_c$	$t_{eff}(s)$	(S/N)
0s	Mg I $b_2$ 5172.7 Å	12	1	2	1	6.3	500
0p	Mg I $b_2$ 5172.7 Å	12	4	16	1	37.62	1000
1	Mg I $b_2$ 5172.7 Å	10	4	16	1	31.81	1000
2	Fe I 5250.2 Å, Fe I 5250.6 Å	8	4	16	1	23.4	1000
3	Fe I 5250.2 Å, Fe I 5250.6 Å	5	2	20	1	10.04	1000
4	Mg I $b_2$ 5172.7 Å	3	4	10	10	54.01	2500
5	Fe I 5250.2 Å, Fe I 5250.6 Å	3	4	10	10	53.60	2500

Table 3.1 Scientific observing modes. From left to right, the columns are: observing mode identifier, measured spectral lines, number of wavelengths, number of modulations, number of accumulations, number of cycles, the effective exposure time and the polarimetric S/N.

### 3.1 TuMag's observing modes

With the purpose of simplifying the operations activities, TuMag operates through a series of so-called observing modes. The observing modes are a list of pre-configured settings tailored for various observations, including both calibration and scientific purposes. Each mode is designed to fulfill the specific objectives of the corresponding observation and enables nearly automatic operation of the instrument during flight.

A summary of the properties for each observing mode is provided in Table 3.1. There are four distinct modes designed to observe the magnesium line. Mode 0s performs a fast, extended scan of the spectral line using 12 wavelength samples: [-40, -30, -20, -10, 0, 10, 20, 30, 40, 50, 60, 65] pm\*, with two accumulations ( $N_a = 2$ ) to maximize scanning speed, and no modulation ( $N_p = 1$ ). Mode 0p is similar to mode 0s but employs a full-vector modulation scheme,  $N_p = 4$ , requiring  $N_a = 16$  to ensure the required S/N. Mode 1 provides a shortened scan of the magnesium line, with measurements taken at [-30, -20, -10, -5, 0, 5, 10, 20, 30, 65] pm, also utilizing the same full-vector modulation scheme. Finally, mode 4 is a "deep" magnetic mode, featuring a highly reduced scan with only three samples at [-10, 0, 10] pm, but with  $N_a = 10$  and  $N_c = 10$  cycles, the latter forcing a repetition of the modulation cycle, thus enhancing the polarimetric sensitivity by increasing the effective exposure time for each modulation and wavelength.

Three observing modes are configured for the iron lines. Mode 2 employs a vectorial modulation scheme applicable to both iron lines, with sampling at [-12, -8, -4, 0, 4, 8, 12, 22] pm. Mode 3 uses a longitudinal modulation scheme, measuring only Stokes I and V, with samples taken at [-8, -4, 4, 8, 22] pm. Lastly, mode 5 closely resembles mode 4, but is configured for the iron lines, with sampling at [-8, 0, 8] pm. The only difference between these two modes is the sampling scheme.

Although most of the parameters are set up by the observing mode and cannot be changed, there are some configurable parameters that allow to slightly modify the observing modes to fit the specific goal of the observation. The most important among these are

\*Sampling positions are given relative to the line core.

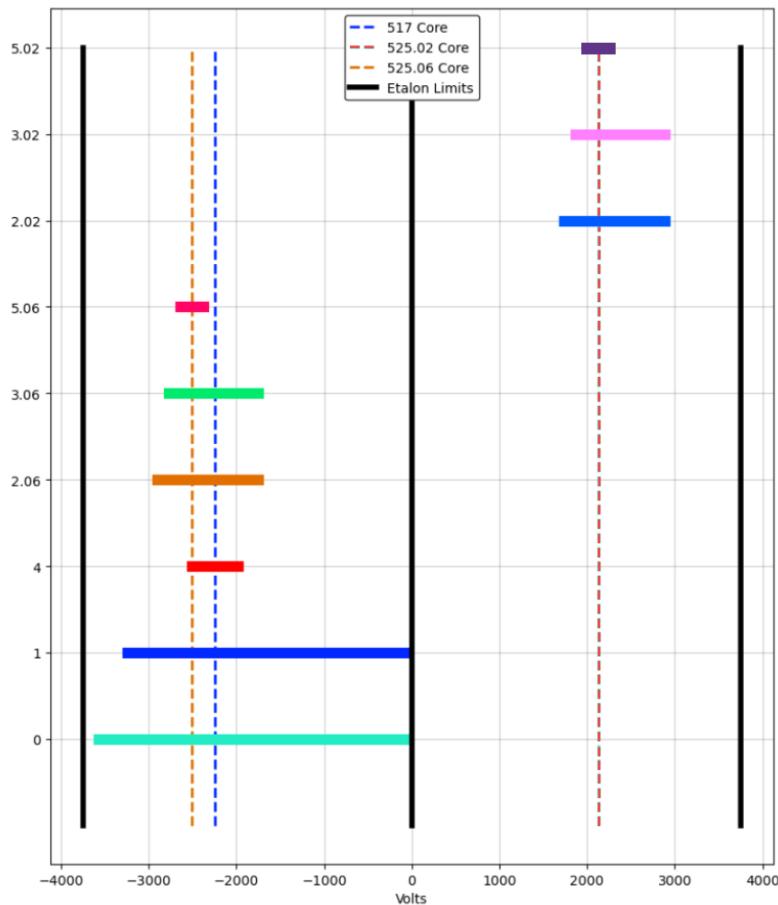


Figure 3.1 Schematic representation of the voltage range covered by all observing modes. The dashed lines indicate the position of the line core as measured during the E2E tests performed at INTA in December 2021. The black lines represent the voltage limits that cannot be crossed in an observing mode.

the following:

- ★  $\lambda_{\text{rep}}$  : A parameter that allows to repeat all the observations carried out at every spectral position before changing wavelength. This parameter is employed for flat-field observations (see the following section) or enhancing the S/N of a specific observation. By default is set to 1.
- ★ Etalon offset : A parameter that allows for the introduction of a global shift to the spectral sampling by offsetting the absolute voltages of the scan, and thus, the wavelengths. This parameter was used to center the spectral line in shorter observing modes affected by solar rotation or other effects that might shift the spectral position. The default value is set to 0 V.
- ★  $N_a$  : Even though the number of accumulations is fixed in nominal observing modes, this parameter was set as configurable in order to allow modifications for faster observations when needed. The default value depends on the observing mode.

Figure 3.1 presents a schematic representation of the voltage ranges for the observing modes when converting spectral sampling to volts. The black lines indicate the voltage

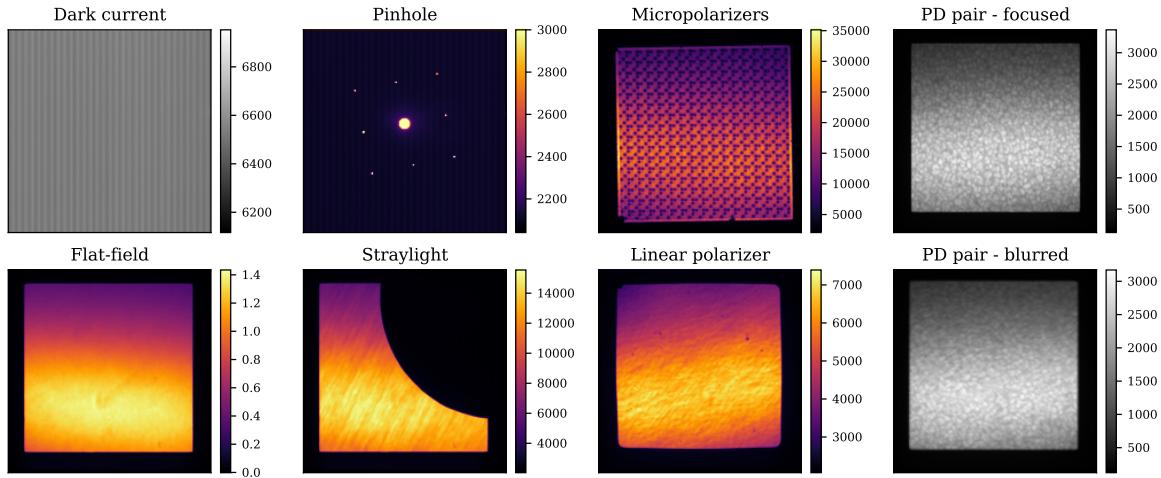


Figure 3.2 Examples of calibration observations. All images, with the exception of the flat-field, are presented in their raw format, without any manipulation or correction applied. The flat-field observation depicted corresponds to the first modulation of the continuum measurement obtained during a flat-field observation corresponding to observing mode 1. All data belong to camera 1, and the colorbar is calibrated in digital counts except for the flat-field which is normalized to its mean value.

boundaries that cannot be surpassed during an observation due to technical constraints. These limits are set at  $\pm 3750$  V as the maximum and minimum values, with an additional limitation at 0 V, since a polarity change poses technical challenges that could not be addressed during an observation mode. These restrictions are important for two cases: first, for Magnesium observation modes, specifically modes 1 and 0, where the continuum measurement is positioned as far from the core as possible, at -80 V, due to the 0 V crossing limitation. Second, when applying an etalon offset to shift the spectral positions of a particular observing mode as the offset cannot cause the final positions to exceed these boundaries.

### 3.1.1 Calibration modes

An additional type of observing modes are also designed for carrying out calibration observations. These calibration observing modes are more flexible than nominal ones, and allow for the configuration of several parameters to better match the observations.

#### 3.1.1.1 Flat-field observations

One of the essential calibration procedures in any telescope-based astronomical observation is the acquisition of flat-field images. These observations are designed to measure intensity variations across the FoV, which arise from several factors, including dust particles, pixel efficiency variations, or in TuMag's case, intensity gradients induced by the etalon, among other sources. The aim is to produce an observation with a uniformly flat intensity dis-

tribution. However, achieving such flat-field observations is not always straightforward, particularly for certain instruments. While ground-based telescopes can utilize twilight periods to observe areas of the sky devoid of stars, space-borne or balloon-borne solar telescopes, such as Sunrise III, must look for alternative methods.

In Sunrise III, flat-field images are generated by deliberately blurring the solar scene through rapid movements of the telescope itself. This is done by the pointing system of the gondola, which allows for moving the FoV in a particular path with the goal of mixing as much as possible the solar granulation. In the end, this process effectively removes the solar structure from the FoV when averaging out multiple blurred observations, resulting in a flat-field image devoid of solar features.

In the case of TuMag, flat-field observations are performed using a modified version of each nominal observing modes, where the  $\lambda_{\text{rep}}$  is set to 4. Additionally, multiple consecutive instances ( $N_{\text{reps}}$ ) of these observations are executed, typically 5 or 7. During data processing, a single flat-field is generated for each wavelength and modulation state by averaging all corresponding observations. Finally, the flats are normalized, typically, to a central area, one by one in order to remove the spectral line features from the flats

Figure 3.2 shows an example of a flat-field observation, for one camera, modulation and wavelength (bottom left panel). The image shows a clear deviation from flatness in the measurement, primarily due to the etalon intensity gradient, which accounts for the change in intensity between the brighter bottom half and the darker top half, and some minor inhomogeneities over the FoV.

### 3.1.1.2 Dark-current observations

A second critical calibration procedure for any observation involving electronic cameras is the measurement of the dark current. In the absence of incident photons, electrons within the camera's wells can still be randomly excited. This spontaneous excitation can be incorrectly interpreted as photon-induced counts when analyzing the data. Dark current observations are designed to characterize these random electronic excitations, which are primarily influenced by the camera's physical conditions, particularly temperature, so that they can be accurately subtracted from the final images. In the case of TuMag, the camera, hereafter SPGCam, is based on the rolling shutter, backside-illuminated GPIXEL SENSE GSENSE400BSI 2kx2k pixel detector (Orozco Suárez et al., 2023). The dark current of the SPGCam, also used for SCIP, is dominated by several sources of error since the camera is used in ambient temperature. In particular, besides the photon noise and the typical thermal dark current, the sensor also shows a dominant fixed pattern noise characterized by sequential vertical strips which needs to be removed in the observations.

For TuMag, dark current calibration involved capturing a series of 50 images with  $N_a = 50$  with no light entering the instrument. As with flat-field observations, a single dark current frame for each camera is generated by averaging all individual observations. In the top left panel of fig. 3.2 a dark current shot is depicted, characterized by the vertical strips of the fixed pattern noise.

### 3.1.1.3 Linear polarizer and micropolarizers observations.

TuMag's filter wheels are equipped with two targets designed to assess the instrument's polarimetric performance: a linear polarizer and a set of micropolarizers. Both targets are situated in the first filter wheel and are used in conjunction with the three distinct prefilters located in the second filter wheel. The linear polarizer serves to evaluate the polarimetric calibration, particularly by quantifying the level of cross-talk between Stokes Q, U, and V, as no circular polarization should be detected when using this target. The micropolarizers provide a more complete assessment, as they consist of multiple linear polarizers oriented at different angles.

Observations with this targets are carried with the three prefilters, at a single wavelength, located in the continuum of each line. For each measurement, a vectorial modulation scheme is employed that allows for the derivation of the four Stokes parameters. In the third column of figure 3.2 observations of both targets are shown.

### 3.1.1.4 Pinhole Observations.

Another calibration target included in the filter wheels is the pinhole target. This target blocks most of the light reaching the instrument, except for a few small holes arranged in a square-like pattern across the FoV, as shown in the top panel of the second column of figure 3.2. A larger hole is located at the center of the FoV, surrounded by eight smaller holes that trace a square with the central hole at its midpoint. These observations serve various purposes, including image alignment, detecting the presence of ghost images, identifying etalon reflections, and determining the PSF of the instrument.

Pinhole observations are conducted similarly to those with polarizers, that is, in combination with the three prefilters at a single wavelength (the continuum of each line), but without applying any modulation.

### 3.1.1.5 Straylight target.

Not all the light that reaches the detector is necessarily the intended signal for a given observation. Some unwanted light, primarily originating from internal reflections along the optical path, may also reach the instrument. This unwanted contribution, known as straylight, contaminates the measurements by reducing contrast, lowering the S/N, and generally degrading the spectral, optical, and polarimetric performance of the instrument.

To address this contamination, TuMag performed a series of observations using a target that blocks part of the FoV (see the bottom panel of the second column of figure 3.2). By analyzing the dark region in these observations, it becomes possible to measure and model the straylight reaching the instrument, allowing for its subsequent removal from the data.

### 3.1.1.6 Prefilter scans.

TuMag observations are very sensible to spectral shifts either from the pre-filters or from the observed spectral line position. The shift of the pre-filters can happen due to changes in the physical conditions of the filter wheels, mainly the temperature, which spectrally shift

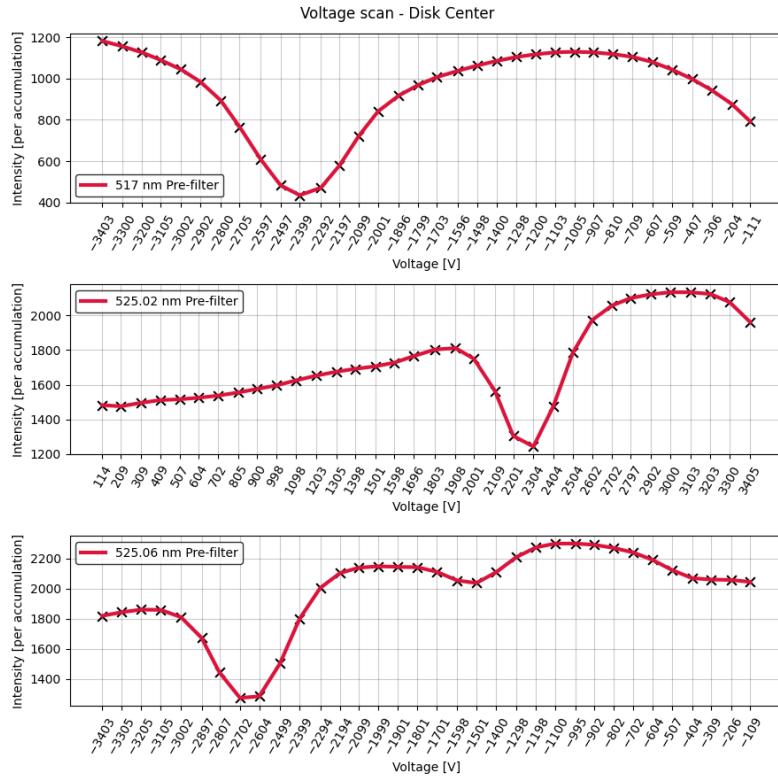


Figure 3.3 Average intensities per accumulation in the center of the FoV of the pre-filter scans performed during the commissioning of the instruments during the first hours of the Sunrise III 2025 campaign.

the transmission peak of the pre-filters. The position of the transmission peak affects the measurements: the further we are from the peak transmission the less the signal to noise due to the decreased transmission. Additionally, even though the temperature of the filter wheels is controlled at all times, small changes in temperature could affect the pre-filters' bandpass which can allow for transmission of secondary orders of the etalon to contaminate the measurement.

Furthermore, due to solar rotation, the spectral position at which the spectral lines are recorded can change. This effect is specially important in observing modes that require great spectral accuracy, such as the deep modes, where only three spectral positions close to the line core are employed. Although this effect is unavoidable and generally of second order, knowing beforehand the position at which a spectral line is recorded allow us to account for this shift in observations that are specially sensible.

To verify the behavior of the pre-filters, quantify the contribution from the etalon's secondary orders, and measure the position of spectral lines, TuMag performs the so-called pre-filter scans, typically conducted before and after observations. These scans involve a rich spectral sweep using the pre-filters employed during the observations, capturing the voltage range of each specific line at intervals of 100V without modulating. Figure 3.3 presents an example of these scans for each pre-filter, recorded during the commissioning phase of the observation campaign. In section 3.3.2.3 we detail how these observations are utilized and provide a brief discussion of the results.

### 3.1.1.7 Phase diversity.

Lastly, TuMag is equipped with the capability to perform phase diversity for image reconstruction. As discussed in previous chapters, applying image reconstruction techniques is essential to meet the optical quality requirements. To this end, TuMag includes a PD plate in the first filter wheel that introduces a known defocus in the images. Capturing images with and without this plate enables the computation of the instrument's spatial PSF, which can then be deconvolved from the data.

PD measurements require quasi-simultaneous pairs of aberrated and unaberrated images. Therefore, TuMag's PD observations consist of a series of 40 rapid, non-accumulated frames with the PD plate, followed by a corresponding series without the PD plate. The feasibility of this sequential scheme for phase diversity techniques has been confirmed in Bailén et al. (2022). A pair of focused-defocused images of quiet-sun observations is shown in the last column of figure 3.2.

## 3.2 Timelines

The operations of Sunrise III were designed to be nearly autonomous to ensure synchronization between the scientific instruments, the telescope, and the CWS, and limit issues in case of a problem with communication for sending telecommands. Given the limited time available for the observation campaign, this autonomy also helps to speed up operations, enabling more observation programs to be accommodated within the mission's duration.

The Sun is a highly dynamic system, exhibiting a wide range of behaviors and phenomena, from large-scale structures such as active regions, or pores, which harbor strong magnetic fields, to smaller, quiet Sun areas containing the so-called network and intranetwork fields, where the solar gas mostly drives the dynamics and structuring of the magnetic fields. This diversity, observable in various spectral ranges and across different regions of the solar disk, demands multiple observations with distinct characteristics.

Prior to the first flight of Sunrise III in 2022, a series of timelines were developed to program both calibration and scientific observation blocks. These timelines were carefully designed by the Sunrise Science Team, taking into account the 70 observing proposals submitted for Sunrise.

Observing proposals that could be fulfilled by targeting the same solar feature, while considering its disk position, were grouped into a single timeline. Each timeline included not only the necessary scientific observation blocks but also the required calibration observations to ensure data accuracy. Thus, timelines consist of a sequence of scientific and calibration observation blocks. The observing blocks within a timeline could vary in content depending on the scientific objectives and the status of the other instruments involved.

In the case of TuMag, each observing block was composed either of a combination of two observing modes executed consecutively, or a single observing mode repeated throughout the block.

The timelines of the Sunrise III mission can be grouped in the following blocks:

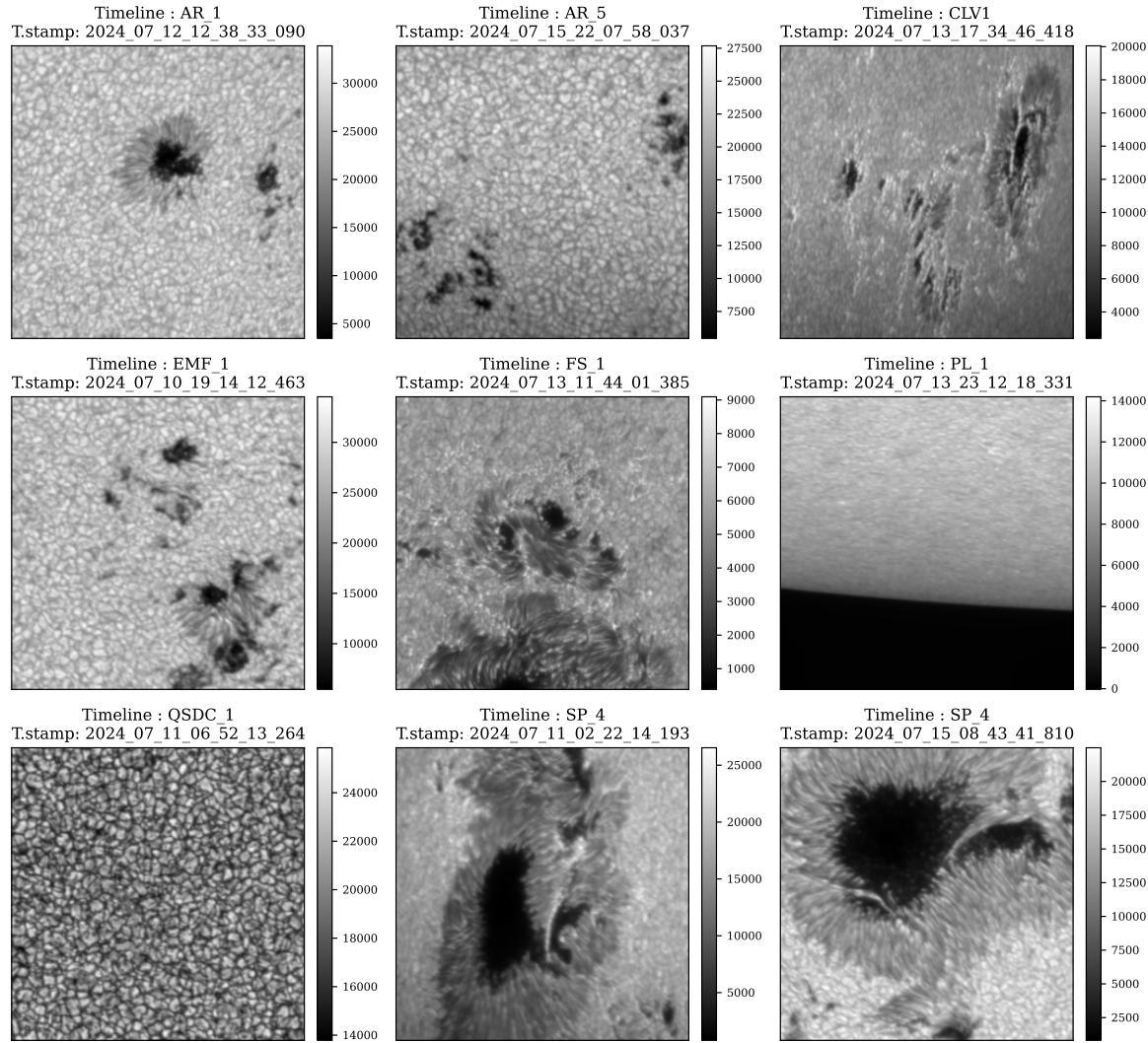


Figure 3.4 Continuum images of the first modulation of the first observation mode from different timelines. The image shown has been flat-fielded and dark-corrected. The timestamp provided corresponds to the first image of the observation mode. The colorbar is given in counts.

- ❶ Quiet Sun observations at disk center (QSDC): focused in regions near the solar disk center that are free from significant solar activity. These timelines typically involve long series of observations aimed at studying the small-scale structure and magnetic flux evolution in the quiet Sun.

There are four distinct timelines in this category: three standard timelines, which employ the nominal observing modes, and a high-cadence version, the QSDC\_HC timeline. The latter employs a modified version of the standard observation modes, where a single wavelength without modulation is recorded at +80 mÅ of the Fe I 525.02 nm spectral line core, with a temporal cadence of approximately one second. Additionally, it includes a modified version of observing mode 3, featuring fewer accumulations to improve temporal cadence to approximately seven seconds. These high-cadence observations are critical to study the wave propagation throughout the solar surface (see Bahauddin & Rast 2021 or Tong et al. 2002).

- ❷ Sunspot observations (SP) are specifically designed to study sunspots. There are four different timelines for this purpose. Some of these are short programs used to track the same sunspot over multiple days, with the goal of studying the evolution and decay of the sunspot. Others are more extensive programs aimed at examining, in greater detail, the magnetic activity of sunspots and their penumbral structures.
- ❸ Polar observations (PL) target the region close to the limb in both poles of the Sun. These areas are of special interest due to their distinct magnetic behavior compared to the disk center. Additionally, these regions provide the opportunity to measure faint signals outside the main solar disk, such as spicules in the lower chromosphere, observed outside the continuum disk in the magnesium line. Two different instances of these timelines were run in the observation campaign which differ by the target spectral lines, and targeted both poles.
- ❹ East and West limb (EW) observations are designed to target the equatorial regions of the solar limb. In addition to exhibiting magnetic structures distinctly different from those observed at the poles, the reason for having a separate timeline from the PL timelines lies in the orientation and technical constraints related to SCIP and SUSI's slits. In these EW observations, the spectrometer slits are aligned parallel to the limb, contrasting with the PL timelines, where the slit is positioned perpendicular to the limb.
- ❺ Active regions (AR) observations are designed to study areas exhibiting solar activity, excluding those specifically focused on in the sunspot programs. These observations typically consist of two-hour series, employing the standard combination of the iron 525.02 nm and magnesium lines, using modes 1 and 2.02, which represent the most common observation block for TuMag. Although five different AR timelines were planned for the Sunrise campaign, only three were executed.
- ❻ Emergence flux (EMF) programs are specifically designed to study active regions that exhibit a large flux emergence. For TuMag, the observation blocks are shared with

those of a the AR programs, namely, the combination of mode 1 and 2.02 for series of around 2 hours.

- Full spectral scan (FS) observations are primarily designed for SUSI, where the instrument scans all available wavelength ranges to produce an atlas of the solar spectrum in the near ultraviolet. These scans are intended to be carried out in both quiet Sun and active regions. For TuMag, FS observations consist of long series focusing on the iron spectral line in quiet Sun regions, while in active regions, they include a combination of iron and magnesium observations.
- The flares programs (FL) were designed for a target of opportunity of a flaring region. These programs were intended to be activated only when an active region showed signs of flaring. For TuMag, the observations during these programs consist of the standard combination of iron 525.02 nm and magnesium spectral lines.
- Center-to-limb variation (CLV) observations were intended to target regions of the solar disk characterized by  $\mu$  values that had not been previously observed. The parameter  $\mu$ , defined as the cosine of the angle between the surface normal and the observer's line of sight, serves as a useful indicator of a region's proximity to the disk center. Specifically,  $\mu$  ranges from 1 at the disk center to 0 at the limb (Thompson, 2006). Conducting CLV observations at previously unmeasured  $\mu$  values enables us to capture data from different regions across the disk, facilitating studies of how observational features vary with their position on the disk.

During the Sunrise III observation campaign, 38 timelines were run, including calibration timelines in addition to the scientific programs presented here. Some examples of the different targets employed during the campaign are shown in fig. 3.4. A detailed record of TuMag's observations can be found online both in the pipeline's repository and in TuMag's official data website<sup>†</sup>.

### 3.3 Pipeline

Before data can be employed for scientific purposes, it has to undergo a process where all the instrumental and spurious effects are removed. This process, usually referred to as data reduction, has to be specifically designed for each instrument, as the particular properties of the instrument come into play. Being a spectropolarimeter, TuMag's data reduction pipeline must, in addition to removing the instrumental artifacts, compute the Stokes components of the incoming light.

In this section we introduce the software that has been developed for TuMag's data processing. Due to the proximity of the data's arrival to the end of this thesis, its important to note that the data reduction is still under development, with some calibration steps still

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<sup>†</sup>[https://www.uv.es/jublanro/tumag\\_data\\_test.html](https://www.uv.es/jublanro/tumag_data_test.html)

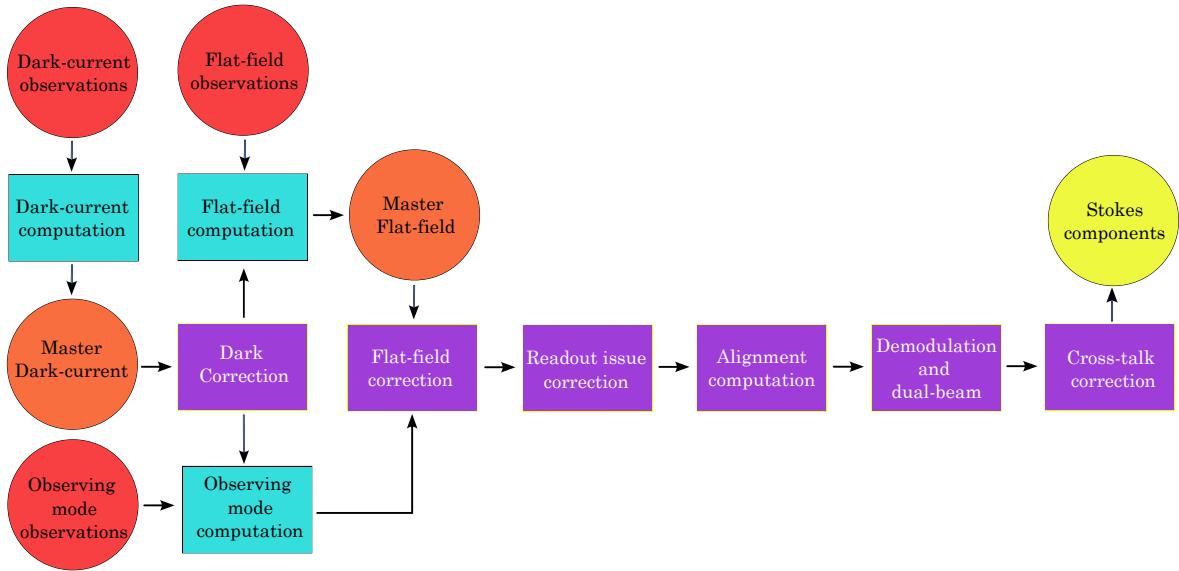


Figure 3.5 Block diagram of the standard reduction process: Blue boxes represent image processing steps, and purple boxes the main reduction computations. Red circles represent raw observations, orange circles represent calibration products generated during the reduction, and finally, the yellow circle represents the final product, the Stokes components.

undeveloped. In the following, we present the current status of the pipeline, along with a few examples of the results. The pipeline is publicly available in a GitHub repository<sup>‡</sup>.

### 3.3.1 Standard data reduction process.

The specific steps that have to be applied to a particular observation depend on the observation mode, and scientific aim of the observation, as different observations may require additional steps prior to the scientific exploitation. However, most data must go through a common set of steps, typically consisting of the following (see also fig. 3.5):

1. Dark current computation.
2. Flat-fielding computation (dark-current corrected).
3. Observing mode images computation (dark-current corrected).
4. Apply flat-field correction.
5. Correction of camera 2 readout issue.
6. Image alignment between modulations and cameras.
7. Demodulation.

<sup>‡</sup>[https://github.com/PabloSGN/TuMags\\_Reduction\\_Pipeline](https://github.com/PabloSGN/TuMags_Reduction_Pipeline)

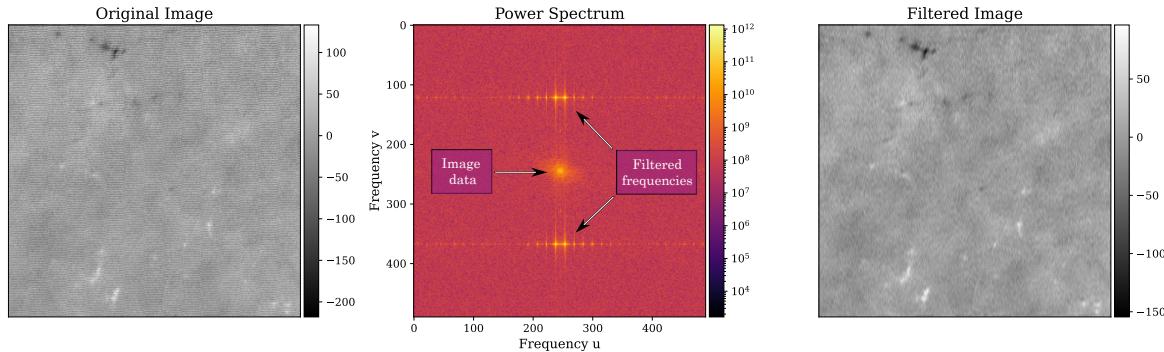


Figure 3.6 Left) Uncorrected Stokes U map in the magnesium wing of quiet Sun observations. Center) Power spectrum of the stokes map showcasing the spatial frequencies of the pattern created due to the readout malfunciton. Right) Same map as on the left with the filtered frequencies of the readout pattern.

### 8. Cross-talk correction and cameras combination.

The data reduction process begins with the dark-current processing, which involves averaging all individual dark frames within a specific set to generate a single dark-current frame per camera. This dark current is then subtracted from all images used in the reduction, including flat-fields, scientific observations, and any other calibration observation, after rescaling the dark-current to the appropriate number of accumulations.

The second step is the flat-field computation. These observations, as previously mentioned, are a modified version of the nominal mode with an increased  $\lambda_{\text{rep}}$  and are repeated  $N_{\text{rep}}$  times. The processing involves averaging all images taken at a specific wavelength for the same modulation, after applying the dark-current correction to every frame. Thus,  $\lambda_{\text{rep}} \times N_{\text{rep}}$  images are averaged to produce a single flat-field frame. To maintain spectral line information, each flat-field frame is normalized to its mean value, as flat-fields taken at the line core have lower intensity than those in the continuum. The goal is to correct intensity variations within a single frame without altering relative intensities across different spectral points.

Having computed the dark-current and the flat-fields, the scientific observations can be corrected by subtracting the dark-current and dividing the resulting image by the flat-field of the corresponding wavelength and modulation.

In addition to dark-current and flat-field corrections, an additional adjustment is required before proceeding with further computations. During operations, the second camera developed a readout issue that was not present during calibrations. This malfunction introduces a recurring spurious pattern in all frames taken by this camera (see the left panel of fig. 3.6). Fortunately, this structure is consistent throughout all measurements and is characterized by a repetitive pattern whose intrinsic spatial frequencies can be identified in the power spectrum (see central panel of fig. 3.6), allowing it to be effectively filtered out, as shown in the right panel of fig. 3.6.

Before computing the Stokes components, the images from different cameras and mod-

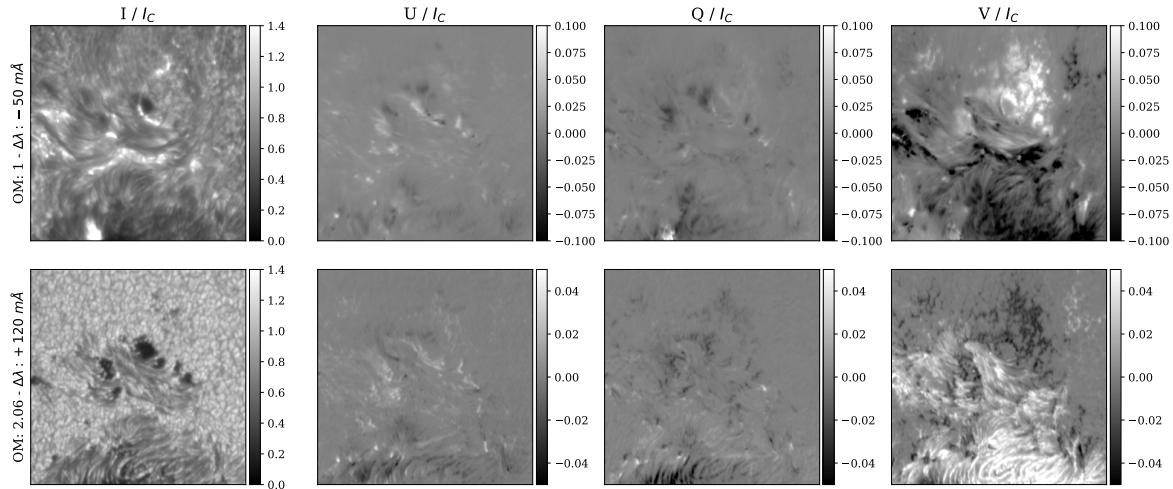


Figure 3.7 Stokes maps in magnesium (top row) and iron 525.06 nm (bottom row) lines wings, measured at  $-50\text{ m}\text{\AA}$  and  $+120\text{ m}\text{\AA}$  from the line core, respectively. No cross-talk correction has been applied. The observation corresponds to a FS timeline ran in a flaring active region. Timestamp of the first observation mode (mode 1) : 2024/07/13 12:28:00.

ulations must be accurately aligned, as they will be combined during demodulation. Any misalignment of the solar structures in the images results in the apparition of spurious polarization signals. The alignment process is carried sequentially: first, images belonging to the first camera of different modulations are aligned between them; then, the images captured by the second camera are aligned with respect to the images of the corresponding modulation of the first. This alignment is performed with subpixel accuracy using the method described in Guizar-Sicairos et al. (2008), which calculates the alignment via a two-dimensional cross-correlation in the Fourier domain.

The Stokes parameters are then computed by applying the demodulation matrix to the aligned and corrected modulations. If the polarimetric response is consistent across the FoV, an average demodulation matrix can be applied uniformly. However, if the system exhibits significant variation across the FoV, a two-dimensional demodulation approach where a unique matrix is assigned to each pixel is required, as large deviations from ideal demodulation are challenging to correct. TuMag's pipeline incorporates both approaches, allowing selection based on the demodulation performance.

After demodulation, data from both cameras are combined into a single map for each Stokes component and wavelength. This is done by adding the Stokes maps from both cameras while normalizing for intensity differences. Combining images from different cameras measuring orthogonal polarization states effectively removes most jitter-induced cross-talk.

Figure 3.7 shows an example of the demodulated stokes maps for observing mode 1 (magnesium) and 2.06 (iron 525.06 nm) at the wings of the spectral line. The intensity map in the magnesium shows the beginning of a flare around the central sunspot.

Due to minor pixel-to-pixel variations when using the average demodulation matrix or residual instrumental artifacts not corrected by flat-fielding, the demodulation process

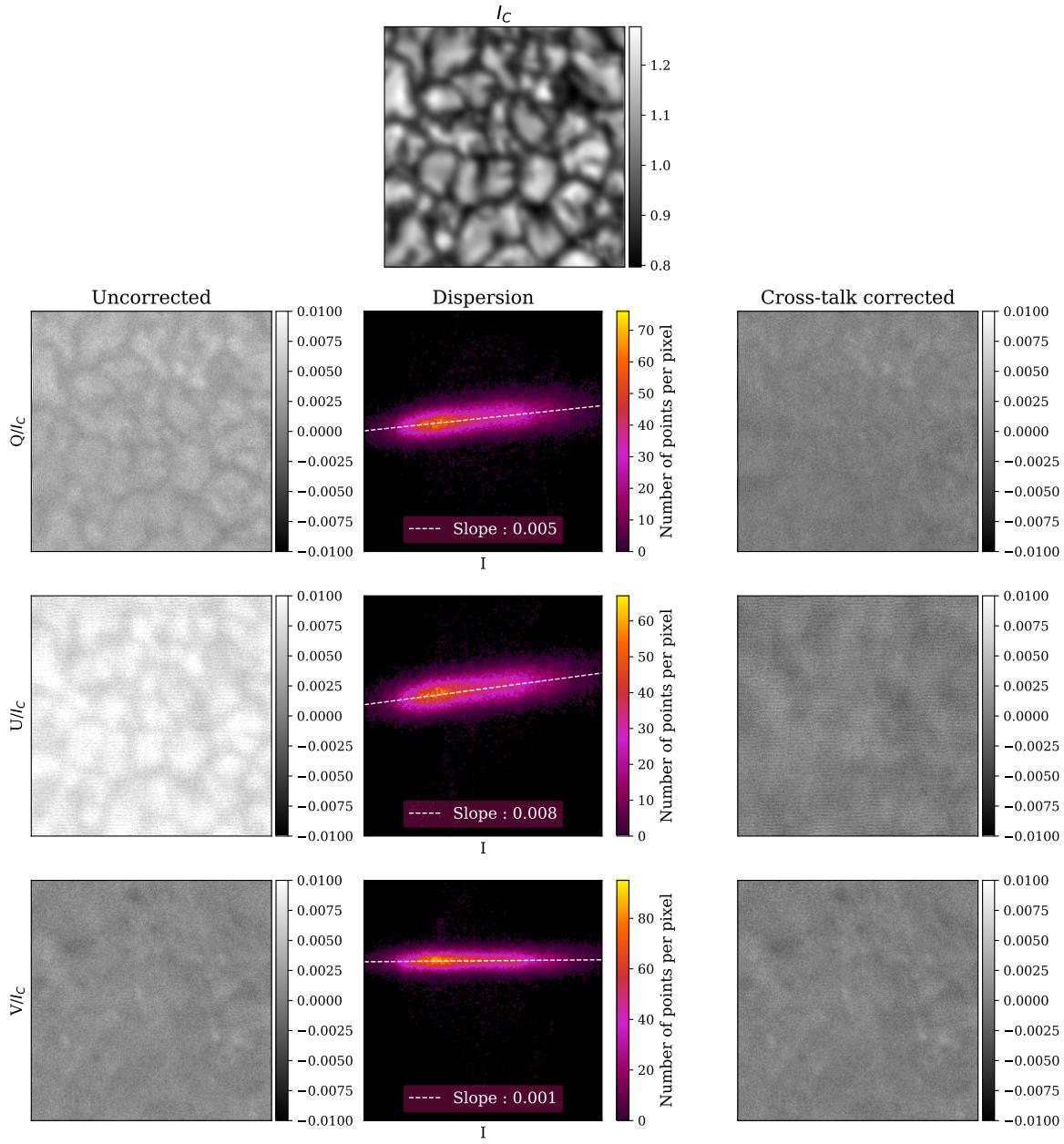


Figure 3.8 Example of a cross-talk correction in a small region of the FoV. Each row shows a different stokes parameter. The left column shows quiet Sun stokes maps after demodulation, the central column shows the dispersion between the intensity and the corresponding stokes parameter, and the right column shows the corrected maps. In this data set, the readout problem has not been assessed and is clearly discernible in Stokes U.

is often imperfect. These imperfections result in contaminated Stokes components, where information from one component appears in others, typically with leakage from Stokes I into Q, U, and/or V. However, if the demodulation matrix closely approximates the ideal matrix, this contamination, known as cross-talk, can be corrected.

Cross-talk contamination between Stokes I and any other given Stokes component can be assessed in regions of the FoV without solar structure, using the continuum. In these regions, linear polarization signals should be absent, and minimal signals should appear in Stokes V. One method to quantify cross-talk from one component ( $I$ ) to another ( $S_{cont}$ ) involves fitting a line to the dispersion map created by plotting one component against the other. The slope of this line indicates the cross-talk level, as no correlation should exist in quiet Sun areas (Collados, 1999). Once this relationship is established and the cross-talk intensity is measured, the correction is applied by removing this linear trend from the data:

$$S_{corr} = S_{cont} - (I * a + b), \quad (3.1)$$

where the relation between the stokes component  $I$  and  $S_{cont}$  has been fitted to the line:  $S_{cont} = I * a + b$ .

Figure 3.8 shows an example of a cross-talk correction in a small region of the FoV in the continuum of a quiet Sun observation. The granulation structure is clearly visible in Q and U before the correction. The central panel shows the dispersion between the corresponding stokes component and the intensity, along with the fitted relation. In the case of Q and U, the relation is clearly stronger than in V, where the slope is almost 0. The right columns shows the result of the correction, with Q and U without the majority of influence of the intensity, although some traces can be found. Nevertheless, the cross-talk before the correction is below the 1%, and thus, the polarimetric sensitivity is larger than  $10^{-3}$ .

### 3.3.2 Extra calibration blocks.

As previously presented, TuMag observations include a series of calibrating observing modes that are not employed in the standard reduction process, namely, polarizers observations, both the lineal polarizer and the micropolarizers set, the pinholes observations, prefilter scans, or PD. These sets of calibrations are meant to be processed separately to aid with the data reduction in observing modes that require it.

The processing of these steps is still in an early stage, and are expected to be fully developed in the following months. Nonetheless, we will now outline the purpose of these observations and their intended role in the reduction process.

#### 3.3.2.1 Image reconstruction.

Image reconstruction is, in truth, one of the steps in the main data pipeline and will eventually be implemented as an additional step applicable to all datasets to maximize TuMag's spatial resolution potential. However, it has been separated in this description because it is not yet fully developed and ready for automatic processing across all datasets.

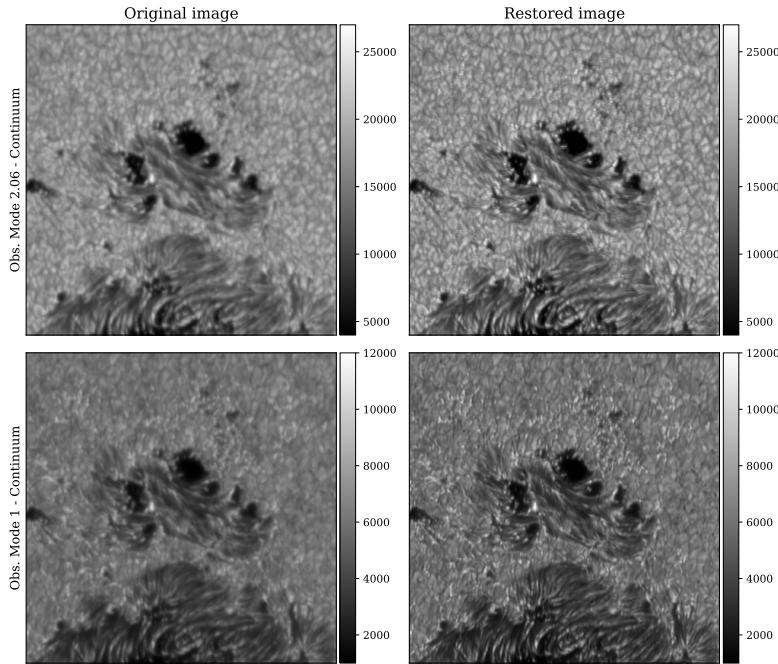


Figure 3.9 Example of image reconstruction in the FS timeline for both the 517 nm (Obs. Mode 1) and 525.06 nm (Obs. Mode 2.06) prefilter. The data set for the PD measurements was taken on the 13<sup>th</sup> at 11:42. The timestamp of the first image of the first observation mode is: 2024/07/13 12:28:00. PD computation made by F.J. Bailén.

The image reconstruction technique consists on deconvolving the PSF of the instrument from the data through a Wiener filter. PD measurements (see sec. 3.1.1.7) are employed to derive the PSF though the determination of the zernike parameters that describe the WFE. These PD measurements are taken before and after scientific observations to ensure the applicability of the reconstruction throughout the whole data series.

Figure 3.9 shows an example of such a reconstruction, for the 517 nm and 525.06 pre-filters. The reconstruction employs the closest PD measurement dataset to the observation and 21 zernikes for the PSF determination.

### 3.3.2.2 On-flight polarimetric calibration.

The presence of cross-talk in the observations can arise from deviations of the instrument's modulation with respect to the modulation derived during on-ground calibrations. In such cases, the demodulation matrix used in the pipeline diverges from the ideal matrix, resulting in a suboptimal demodulation process. However, TuMag is equipped with both linear polarizer and micropolarizer targets to evaluate the demodulation schemes.

Both polarizer targets can be utilized to assess the level of cross-talk in the observations. When a linear polarizer is placed in front of the instrument, no circular polarization should be inferred after proper processing and demodulation. Any residual circular polarization would indicate the level of cross-talk from Stokes I to Stokes V. Similarly, knowing the polarizer's orientation relative to the instrument, it is possible to quantify cross-talk between Stokes Q and U, something that is not easily achievable with regular observations. These calibrations are still ongoing but will help us enhance the instrument's polarimetric accuracy beyond the standard cross-talk corrections commonly applied in solar observations. Additionally, the approach includes modifying the modulation matrices themselves, which

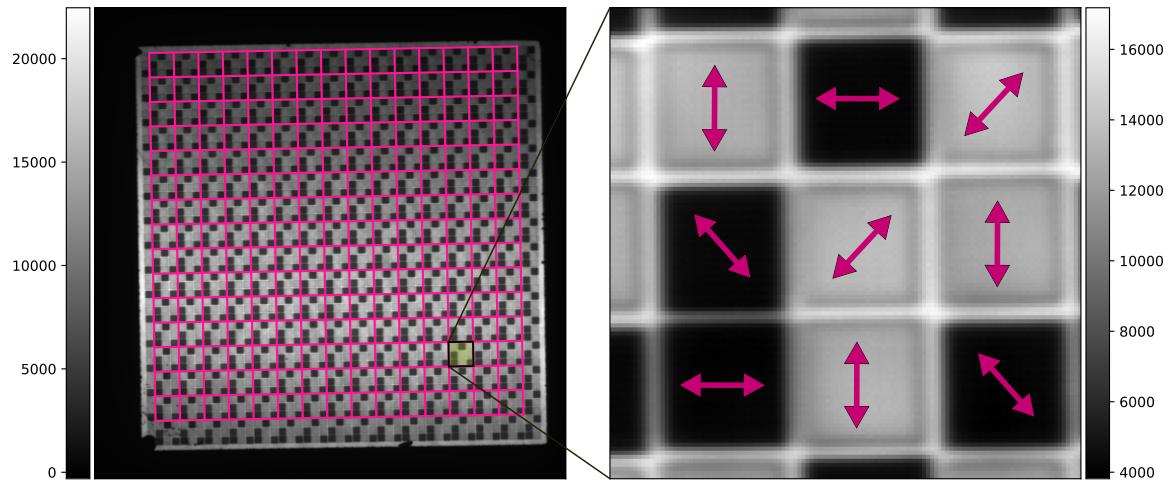


Figure 3.10 Micropolarizer observation with the boundaries of the array of linear polarizers overplotted. The right panel shows the orientation of the linear polarizers that compose each array.

is a more effective method for maintaining low cross-talk levels.

Micropolarizer observations further allow this assessment to be performed across different regions within the FoV. The micropolarizers are composed of 3x3 arrays of small linear polarizers, each oriented in different directions (see Fig. 3.10). This setup enables the same evaluation conducted with the linear polarizer to be applied to each individual micropolarizer.

### 3.3.2.3 On-flight spectral calibration.

One of the most important calibration procedures that is still under development is the on-flight spectral calibration or prefilter extraction. From both the on-ground calibrations and the spectral scans conducted during flight (see Sect. 3.1.1.6), it is evident that the prefilters are not perfectly centered, and the measured intensity is affected differently depending on the spectral position. In particular, magnesium line observations are the most affected by this due to the width of the spectral line.

By analyzing the prefilter scans—recorded with rich spectral sampling—and using an analytical model of the etalon’s transmission profile, we can carefully assess the contributions of both the second order and the prefilter effects through a fitting procedure. Specifically, we compare the expected intensities for a given prefilter position and etalon parameter set to the observed intensities. This comparison enables us to fit the prefilter and/or etalon properties to match the observations.

Figure 3.11 illustrates an example of this analysis for the magnesium prefilter, where only the width and spectral position of the prefilter’s peak transmission were fitted. The results indicate a slight redshift of the prefilter relative to the line core. While small, this shift allows contamination from the etalon’s second order, introducing light from the spectral line at  $\sim 5171.6 \text{ \AA}$  into the measurements of the magnesium line’s right wing. These kind

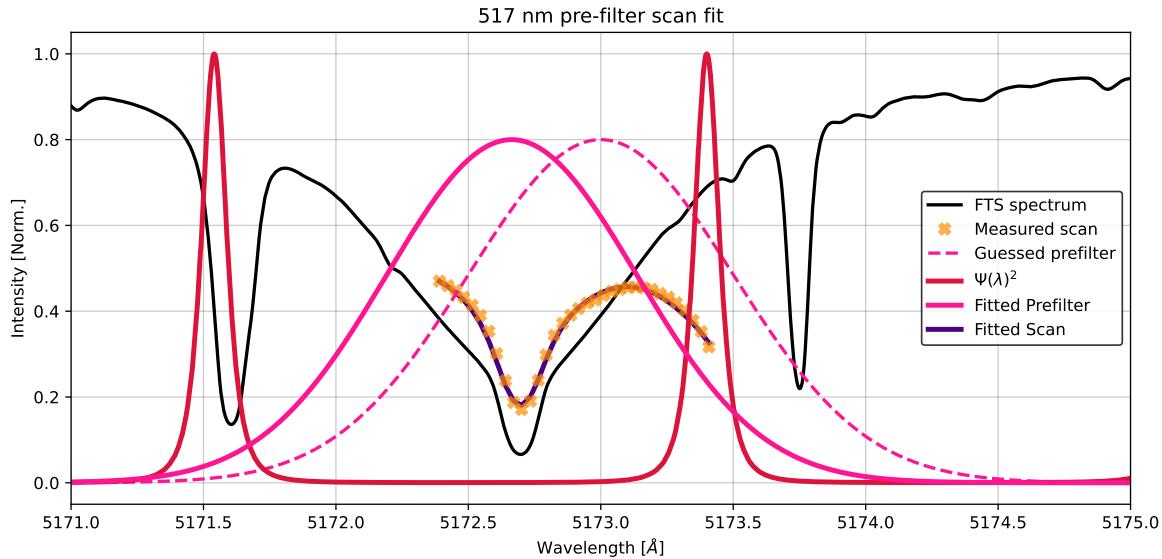


Figure 3.11 Fitting of the 517 nm pre-filter scan recorded on the 10<sup>th</sup> of July at 14:21 UTC during the commissioning phase. The pre-filter measurements (orange crosses) have been normalized to the expected intensity of the spectral line for better comparison. The dark blue line shows the expected scan for the fitted pre-filter (solid pink line) and the etalon transmission profile (red).

of studies enable the correction of prefilter effects and the quantification of second-order contamination, allowing its removal from the measurements.

These results are preliminary and require enhancements, such as replacing the Gaussian model with the actual prefilter transmission profile and incorporating a more complex etalon model that includes stray-light contamination. The fitting procedure employs Newton's method, utilizing analytical expressions for the transmission profiles and their derivatives. This method, originally developed for other works, was designed with TuMag applications in mind and will be discussed in detail in the next chapter.



## CHAPTER 4

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# CHALLENGES IN DATA REDUCTION

### *ETALON CAVITY MAP*

In previous chapters, we have focused on TuMag, its properties, and the correction of its data. However, there are other tunable spectropolarimeters, each with its own specific characteristics, advantages, and challenges. In this chapter, we shift our focus away from TuMag and turn our attention to etalon-based magnetographs in general, with special interest on those with their etalon in a telecentric configuration.

Our interest in studying these kind of instrumentation lies in their extended use in the field of solar physics. Their spectroscopic and tunability properties make them especially suitable for selecting a narrow spectral band of incoming light. They also offer a two-dimensional view of the solar scene, hence allowing for the implementation of powerful and widespread image post-processing reconstruction techniques, such as phase diversity (Gonsalves, 1982) and multi-object multi-frame blind deconvolution (MOMFBD; Van Noort et al. 2005), which are difficult to implement in slit-based spectrographs (Noda et al. 2015, van Noort 2017). Many state-of-the-art instruments use FPIs as narrowband tunable filters. Among others, these instruments include the spaceborne Polarimetric and Helioseismic Imager (Solanki et al., 2020) aboard the Solar Orbiter mission (Müller et al., 2020) (SO/PHI); the Imaging Magnetograph Experiment (IMaX) instrument (Martínez Pillet et al., 2011), which flew on the first two flights of the balloon-born SUNRISE observatory (Barthol et al. 2011, Solanki et al. 2017); and the Tunable Magnetograph (TuMag) instrument for its third edition. These instruments are based on solid LiNbO<sub>3</sub> etalons. Regarding ground-based instruments, some examples include the Crisp Imaging Spectro-Polarimeter (CRISP) at the Swedish 1-m Solar telescope (Scharmer et al., 2008b) at the Observatorio del Roque de los Muchachos in La Palma, Canary Islands; the GREGOR Fabry-Perot Interferometer (GFPI; Puschmann et al. 2013, Schmidt et al. 2012) at the Observatorio del Teide in Tenerife, Canary Islands; the Visible Tunable Filter (VTF; Schmidt et al., 2016) developed for the *Daniel K. Inouye Solar Telescope* (DKIST; Rimmele et al., 2020) of the Haleakalā Observatory in Hawaii; and the future Tunable Imaging Spectropolarimeter (TIS) of the European Solar Telescope (Noda et al., 2022), all of which are based on air-gapped etalons.

Currently, there is an ongoing debate within the scientific community regarding the optimal optical configuration for the etalon in spectropolarimeters, whether it should be collimated or telecentric. Since the seminal work of Beckers 1998 where they carried an analysis of the optical performance of FPIs, the debate has garnered significant interest, as evidenced by the numerous studies addressing the properties of each configuration. Notable contributions include the four works by Bailén et al. (Bailén et al. 2019a, Bailén et al. 2019b, Bailén et al. 2020, Bailén et al. 2021), an extensive analysis on topics such as the impact of defects, applications for instrumentation, and the analytical formulation of the etalon's transmission profiles. Other examples include the studies of Scharmer (2006), a detailed assessment of the comparison in optical performance between configurations, as well as the works of Kentischer et al. 1998 and Cavallini 2006, which discuss the properties of the etalons in the Telecentric Etalon Solar Spectropolarimeter (TESOS) and the Interferometric BIdimensional Spectrometer (IBIS), respectively. Additionally, the review of Scharmer 2006 provides a broad and comprehensive overview of this topic. The reality is that it is challenging to provide a definitive answer to this question, as each configuration has its own advantages and disadvantages.

The primary argument against collimated mounts is the amplification of wavefront errors resulting from the large footprint of the light rays on the etalon plates, which includes both large and small scale defects (Bailén et al., 2023). This amplification deteriorates the optical quality of these setups and has promoted the use of telecentric setups, where the footprints of the light rays are much smaller and the optical performance is less affected by large scale defects.

Despite the improvement in optical performance, the telecentric configuration is no exempt of challenges. In this configuration each light ray traverses the etalon through different regions, thus being affected differently at each point from the various small scale defects present in the etalon. These defects, compose the so-called, cavity-map and its correction can be one of the main challenges of employing these setups.

This chapter aims to provide a description of telecentric configurations for etalons within the context of solar spectropolarimeters. We will begin by exploring the analytical formulation of the transmission profiles and spatial PSF of FPI's in both collimated and telecentric configurations. Following this, we will delve into the effects of the cavity error in solar observations, through a simulation of an observation of a Sunspot. Then, we will present a strategy to derive the cavity map from flat field observations in an attempt to improve the data correction.

## 4.1 One device, two configurations.

We established in section 1.4.1 that the observed intensity distribution at the coordinates  $\xi, \eta$  of the focal plane of any etalon-based instrument tuned to a wavelength  $\lambda_s$  obeys the following expression (Bailén et al., 2019a):

$$I(\xi, \eta; \lambda_s) = g(\xi, \eta) \int_0^\infty T(\lambda) \iint O(\xi_0, \eta_0; \lambda) S(\xi_0, \eta_0; \xi, \eta; \lambda - \lambda_s) d\xi_0 d\eta_0 d\lambda, \quad (4.1)$$

where  $T(\lambda)$  accounts for the transmission of the order-sorting pre-filter,  $O(\xi_0, \eta_0; \lambda)$  represents the brightness distribution of the observed object at the point  $(\xi_0, \eta_0)$  and wavelengths  $\lambda$ ,  $S(\xi_0, \eta_0; \xi, \eta; \lambda - \lambda_s)$  accounts for the imaging response of the instrument when tuned at the wavelength  $\lambda_s$ , and  $g(\xi, \eta)$  represents a spatial gain factor that accounts for wavelength independent pixel-to-pixel intensity fluctuations occurring in the focal plane due to differences in the detectors' sensitivity.

The imaging response of the instrument coincides with the PSF of the instrument when the optical response is invariant against translations. In such a case, we can express the imaging response as:  $S = S(\xi - \xi_0, \eta - \eta_0; \lambda - \lambda_s)$ , and also substitute the last two integrals by the convolution operator. However, this is not strictly true in etalon-based instruments, where the response varies pixel to pixel either because of etalon irregularities or because of variations in the illumination across its clear aperture.

Deriving  $S$  requires determining the electric field of the polychromatic wave in the image plane. This field can be calculated by Fourier transforming the electric field  $E^{(t)}$  across the pupil, such that the electric field at any point  $(\xi, \eta)$  of the image plane follows the expression (Bailén et al., 2019a):

$$E^{(t)}(\xi, \eta) = \frac{1}{\pi R_{pup}^2} \int \int_{pup} E^{(t)}(x, y) e^{-ik(\xi x/f + \eta y/f)} dx dy, \quad (4.2)$$

where  $(x, y)$  are the coordinates over the pupil,  $f$  stands for the focal length, and  $R_{pup}$  is the radius of the pupil. It can also be shown that the vector electric fields transmitted by the etalon can be expressed as:

$$E^{(t)}(\xi, \eta) = \frac{\sqrt{\tau}}{1 - R} \frac{e^{i\delta/2} - Re^{-i\delta/2}}{1 + F \sin^2(\delta/2)} E^{(i)}, \quad (4.3)$$

where  $\tau$  is the transmission factor for normal incidence,  $R$  stands for the reflectivity of the etalon mirrors,  $F$  is a factor defined as  $F \equiv 4R(1 - R)^{-2}$ ,  $E^{(i)}$  are the incident electric fields, and  $\delta$  stands for the phase differences between the transmitted and incident rays.

The transmission profile of the etalon  $S$  is defined as the average ratio between the transmitted and incident intensities, calculated from the complex conjugate of the corresponding electric fields. The dependence of  $\delta$  with the coordinates  $(\xi, \eta)$  varies depending on the illumination setup of the etalon, whether collimated or telecentric. Consequently, each configuration has a unique response and is differently affected by inhomogeneities (defects) in the etalon's properties.

### 4.1.1 Collimated configuration

Collimated mounts are characterized for having the etalon located at the pupil plane placed in collimated space and therefore receive a collimated beam with different incidence angles

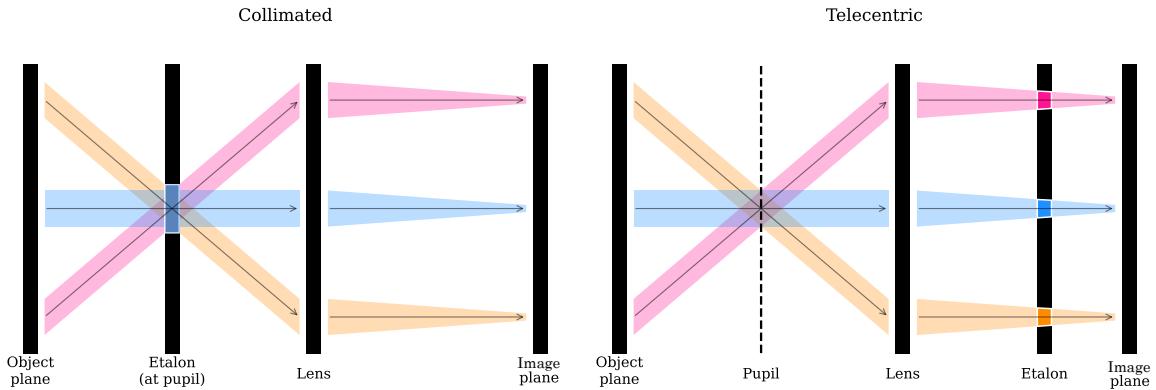


Figure 4.1 Schematic representation of the two optical setups of an FPI, collimated (left) and telecentric (right). The different colors represent distinct light rays originating from various points on the object plane. The white boxes in the etalon highlight the sections that are traversed by the light rays.

for each point of the observed object. As illustrated in the schematic on the left side of fig. 4.1, light from any point on the object will illuminate the same area of the etalon. Consequently, any local defects on the etalon cavities or on the plates' parallelism are averaged all over the clear aperture, thus making the optical quality constant along the FoV. However, the angle of incidence of the light beam varies along the FoV, thus shifting the spectral transmission profile.

Analytical solutions of equation (4.2) are impossible to obtain if  $\delta$  has a dependence on the pupil coordinates, as is the case of collimated etalons with a presence of local defects. In that case, the wavelength-dependent PSF of the etalon has to be evaluated numerically.

However, in order to study the spectral behavior of the PSF, we can, as a first-order approximation, disregard the spatial PSF and focus solely on the spectral transmission profile  $\psi$ . Under this assumption, the phase difference between the incident and transmitted rays of an ideal collimated etalon can be expressed as:

$$\delta(\xi, \eta, \lambda) = \frac{4\pi}{\lambda} nd \cos(\theta(\xi, \eta)), \quad (4.4)$$

where  $n$  stands for the refractive index of the etalon cavity,  $d$  is the distance between the mirrors and  $\theta$  is the angle of incidence. In such a case, the spectral transmission profile can be obtained from  $E^{(t)} E^{(t)*}$ , where the asterisk indicates the complex conjugate, and follows the expression:

$$\psi(\xi, \eta, \lambda) = \frac{\tau}{1 + F \sin^2(\delta(\xi, \eta, \lambda)/2)}. \quad (4.5)$$

The spectral behaviour of the transmission profile, such as the spectral position of the resonance peaks and the distance between them (the free spectral range), is encoded in the parameter  $\delta$ , which is a function of the refractive index of the etalon cavity, the distance

between mirrors, and the angle of the incident beam. The reflectivity  $R$  of the mirrors determines the width of the resonance peaks through the parameter  $F$ ,  $F \equiv 4R(1 - R)^{-2}$ .

Local defects in the collimated configuration are averaged out, which means that  $d$  and  $n$  respectively represent the mean values of the thickness and refractive index across the clear aperture of the FPI, and thus remain constant for every pixel. Yet, they produce a broadening of the transmission profile and worsen the optical quality of the instrument. However, the spatial dependence of  $\psi$  naturally arises from  $\theta$ , which varies from pixel to pixel.

Assessing the spatial PSF of the FPI is more challenging, as it can only be determined analytically for monochromatic light and in the absence of defects. We will not delve into the equations for this specific scenario as it lies beyond the scope of this thesis. However, interested readers are referred to the work of Bailén et al. (2023), where this topic is extensively discussed.

### 4.1.2 Telecentric configuration

In the telecentric configuration, the etalon is placed very close to an intermediate focal plane, while the pupil is focused at infinity. As shown in the sketch on the right side of fig. 4.1, in this setup, the etalon is illuminated by cones of rays that are parallel to each other, thus passing through different sections of the interferometer. Local inhomogeneities (defects or cavities) on the etalon produce differences in the transmission profile across the FoV, which are directly mapped into the image plane. This means that the optical response and the transmission profile shift locally over the image plane.

In telecentric configurations,  $\delta$  always depends on the coordinates of the pupil, even in the absence of defects, since each point in the etalon sees a cone of rays coming from different parts of the pupil. Thus, as stated before, solutions to equation (4.2) are to be found numerically. Nonetheless, if we neglect the spatial PSF once again, we can derive an analytical expression for an ideal telecentric etalon, where all light cones impact perpendicularly.

It is possible to recast eq. (4.2) in terms of the radial coordinates of the pupil and analytically solve the equations. The resulting spectral transmission profile of an ideal telecentric etalon is given by (Bailén et al., 2021):

$$\Psi(\xi, \eta, \lambda) = \Re{E(a(\xi, \eta, \lambda), b(\xi, \eta, \lambda))}^2 + \Im{E(a(\xi, \eta, \lambda), b(\xi, \eta, \lambda))}^2, \quad (4.6)$$

with  $E(a(\xi, \eta, \lambda), b(\xi, \eta))$  being:

$$\begin{aligned} E(a(\xi, \eta, \lambda), b(\xi, \eta)) = & 2\sqrt{\tau} \left\{ \frac{1}{\alpha_1} [\arctan(\gamma_1) - \arctan(\gamma_2)] + \right. \\ & \left. i \frac{1+R}{1-R} \frac{1}{\alpha_2} \left[ \ln \left( \frac{(1+\gamma_3)^2 + \gamma_4^2}{(1-\gamma_3)^2 + \gamma_4^2} \right) - \ln \left( \frac{(1+\gamma_3)^2 + \gamma_5^2}{(1-\gamma_3)^2 + \gamma_5^2} \right) \right] \right\}, \quad (4.7) \end{aligned}$$

where, the auxiliary functions are defined as:

$$\begin{aligned}
 a(\xi, \eta, \lambda) &\equiv \frac{2\pi}{\lambda} n(\xi, \eta) d(\xi, \eta) , \\
 b(\xi, \eta) &\equiv \frac{1}{8n(\xi, \eta)^2 (f\#)^2} , \\
 \alpha_1 &\equiv 2ab\sqrt{F} , \\
 \alpha_2 &\equiv 2\alpha_1\sqrt{F+1} , \\
 \gamma_1 &\equiv \sqrt{F} \sin a , \\
 \gamma_2 &\equiv \sqrt{F} \sin(a[1-b]) , \\
 \gamma_3 &\equiv \sqrt{\frac{F}{F+1}} , \\
 \gamma_4 &\equiv \frac{\tan(a/2[1-b])}{\sqrt{F+1}} , \\
 \gamma_5 &\equiv \frac{\tan(a/2)}{\sqrt{F+1}} .
 \end{aligned} \tag{4.8}$$

The parameter  $a$  has the same role as  $\delta$  for the collimated case. However, the dependence on the image plane coordinates in this case is caused by potential variations in  $n$  and/or  $d$ , as each light beam traverses different sections of the etalon. These variations constitute the so-called "cavity map" of a telecentric etalon and must always be taken into account during data reduction processes.

The parameter  $b$  accounts for the contribution of the focal ratio,  $f\#$ , and has an impact on the spectral resolution, among other effects (Beckers, 1998). Thus, the resolution is affected by both  $F$  and  $f\#$ , through the parameters  $a$  and  $b$ .

#### 4.1.2.1 Telecentric imperfect configuration

The equations shown in Sect. 4.1.2 are valid whenever the incident cone of rays is perpendicular to the etalon mirrors. We refer to this situation hereinafter as "perfect telecentrism". However, real instruments are likely to present deviations from such an ideal case. These deviations can be caused by an intentional tilt of the etalon to suppress ghost images on the detector (Scharmer, 2006), by an accidental off-axis incidence caused by deviations from the ideal paraxial propagation of rays within the instrument, or simply because of misalignment of the optical components. In the three cases, the incident cone of rays is no longer perpendicular to the etalon, and hence, we consider these scenarios as if they were imperfections in the telecentrism degree. One important consequence of the loss of telecentrism is an asymmetrization of the transmission profile that must be accounted for when modeling the instrument response.

The transmission profile in this case is influenced by the angle of incidence of the chief ray at each point of the clear aperture of the etalon, in addition to the parameters mentioned in the previous sections. Unfortunately, the equations for the transmission profile in these

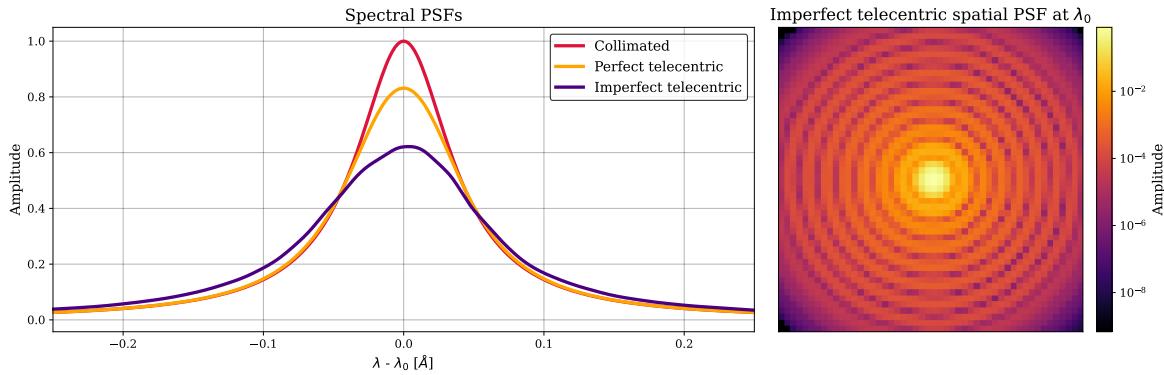


Figure 4.2 *Left*: central peak of the etalon’s spectral transmission profile for the three different configurations. *Right*: Spatial PSF of the imperfect telecentric etalon at  $\lambda_0$ . The parameters of the etalon are  $R = 0.92$ ,  $n = 2.29$ ,  $d = 251 \mu\text{m}$ ,  $f\# = 56$ ,  $\theta = 0^\circ$  (collimated and perfect telecentric), and  $\Theta = 0.3^\circ$  (imperfect telecentric).

configurations are much more complicated than in the ideal case, and can no longer be analytically solved. We must revisit equation (4.2) and solve the integrals numerically.

Figure 4.2 shows on the left the transmission profile corresponding to the three different scenarios: collimated illumination of the etalon, perfect telecentrism, and imperfect telecentrism. The etalon parameters have been selected to coincide with those of SO/PHI’s etalon. In both the collimated and perfect telecentric configurations, a normal incidence ( $\theta = 0$ ) scenario is shown, whereas in the imperfect telecentric case, we assumed an angle of incidence of the chief ray,  $\Theta$ , of  $0.3^\circ$ . The parameter  $a$  has been adjusted slightly in order to tune the transmission profile at  $\lambda_0$ .

Regarding the properties of each profile, note that the telecentric configurations achieve lower peak transmissions than the collimated case. In addition, the telecentric profiles are wider due to the different incidence angles across the illuminating cone of rays. Such a broadening increases with decreasing f-ratios. Lastly, non-normal incidence of the chief ray in the telecentric configuration further widens and shifts ( $\sim 4 \text{ m}\text{\AA}$  for  $\Theta = 0.3^\circ$ ) the profile, in addition to making it asymmetrical.

## 4.2 Sunspot observation simulation

The analytical formulations provide us with the necessary tools to investigate the impact of the cavity map on observational data and the consequences of incorrect or incomplete corrections. Our objective is to quantify the spurious effects of the cavity map on scientific products, specifically LOS velocities and magnetic field strength. To achieve this, we will simulate a series of sunspot observations using a telecentric FPI and attempt to correct these observations.

The simulations are carried out introducing cavity errors to the etalon and accounting for gain variations across the cameras’ FoV. To accurately reflect the real scenario, the data

will require flat-field correction before analysis. Consequently, we will simulate not only the scientific observations but also the flat-field observations. The following sections detail the process for the simulation of both the sunspot observations and the flat-fields.

We have chosen to employ a sunspot for this study since they are one of our main *laboratories* for the study of the magnetic field and dynamics of the solar photosphere. Additionally, they exhibit complex and diverse structures that facilitate the identification of etalon effects on observations as a function of solar structure. Sunspots are dark regions of the solar surface where strong magnetic fields gather. The innermost part of the spot, the umbra, with a brightness around the 20% of its surroundings, hosts very strong magnetic fields oriented almost perpendicular to the solar's surface. Surrounding the umbra in fully developed sunspots is the penumbra, a brighter region characterized by a radial filamentary structure with a nearly horizontal outflow of the plasma known as the Evershed flow (Evershed, 1909).

The physical mechanisms driving the phenomena in these regions are not yet fully understood and have been a topic of discussion for many years, and still are. Processes such as the Evershed flow lack a universally accepted theoretical model, and numerous studies attempt to provide a theoretical basis for the observations, often presenting conflicting interpretations. Some examples of these works are Schlichenmaier et al. (1998), or Solanki & Montavon (1993), where they interpret the evershed flow as a hot gas confined to magnetic flux tubes that rise due to convection processes. In contrast, alternative models such as the one proposed by Scharmer & Spruit (2006) and Spruit & Scharmer (2006), and later updated in Scharmer et al. (2008a), suggest that the observed filaments are field-free gaps where standard convection occurs. According to these models, the convective cells are elongated as the upward flow is redirected by the inclined magnetic field characteristic of the penumbra, resulting in the outward flow.

Accurate measurements of velocities and magnetic fields are of paramount importance for deciphering these processes, as the weak and small-scale manifestations of these effects may be crucial for their understanding. Examples for this are the works of Scharmer & Henriques 2012 or Pozuelo et al. 2015, where they found and study lateral downflows at the edge of penumbral filaments, supporting the model of penumbral convection from filament dynamics. However, these downflows are very challenging to detect, and require very high spatial resolution and accurate velocity measurements. For this reason, we will focus on the study of the spurious effects of the cavity error in the measurements of velocities and magnetic fields, with a special emphasis on penumbral flows.

The target of our observations will be a Magnetohydrodynamic (MHD) simulation of a sunspot in the photosphere kindly provided by C. Quintero Noda. We will observe it through an FPI similar to the one flying aboard the SO as part of the PHI instrument. This section begins with an overview of the simulated data (Sect.4.2.1), followed by a detailed explanation of the observation simulation (Sect.4.2.2). Subsequently, we present and discuss the different flat-fielding strategies in section 4.2.3. The section concludes with the discussion of the measurements of the LOS velocities and magnetic field strength in sections 4.2.4 and 4.2.5, respectively.

### 4.2.1 Simulated data.

The target of the observations is a MHD simulation of a sunspot taken from Rempel (2012). These simulations, generated using the MuRaM code (Vögler et al., 2005), were employed to synthesize the Stokes profiles with the SIR code (Ruiz Cobo & del Toro Iniesta, 1992). Specifically, we utilize a simulation with dimensions of  $1536 \times 128 \times 1536$  pixels, with a grid spacing of 32 km in the horizontal direction and 16 km in the vertical. The spectral synthesis was performed with a sampling of  $10 \text{ m}\text{\AA}/\text{pixel}$  across a range from -1500 to  $1500 \text{ m}\text{\AA}$  relative to the Fe I  $6173\text{\AA}$  line core. For a detailed description of the simulation we refer the reader to Noda et al. (2023).

As explained in previous chapters, tunable spectropolarimeters do not measure the stokes components directly, but rather infer it from a series of independent measurements. In order to replicate this behaviour, we generated four modulations from the MHD simulations employing an ideal modulation matrix. The images are demodulated using an ideal demodulation matrix, obtained by directly inverting the modulation matrix. This ensures that the results are free from any cross-talk contamination.

### 4.2.2 Observations simulation.

All the instruments built around the use of an etalon as the wavelength-selector element operate in a very similar way. They scan a spectral line by tuning the etalon (by changing the distance between mirrors and/or by applying a voltage to modify the refractive index) to a desired number of wavelengths along the spectral line. At each spectral position, the solar scene is recorded. The measured intensity is approximately given by Eq. (4.1), with the etalon's transmission profile centered at the desired wavelength.

We have carried out two sets of simulations, one with a perfect telecentric configuration, where the incidence of the chief ray is normal to the etalon's surface, and one with an angle of incidence of the chief ray of  $0.5^\circ$ , that is, with a telecentric imperfect configuration. For both sets a simulation of the whole spectral scan is carried out. For these scans, the  $6173 \text{ \AA}$  spectral line is sampled with 45 wavelengths from -  $500 \text{ m}\text{\AA}$  to +  $500 \text{ m}\text{\AA}$ , relative to the line's core rest position, in steps of  $10 \text{ m}\text{\AA}$ . At each spectral position, the solar scene is recorded for each of the four generated modulations.

These measurements are performed following equation (4.1) with the omission of the pre-filter. In practice, it is not often possible to fully characterize the pre-filter, and therefore, for these simulations, we assumed it has a rectangular shape centered at the wavelength of the observed spectral line ( $\lambda_0$ ) and a width of  $2\Delta\lambda$  such that only one order of the etalon passes through. With this consideration, equation (4.12) can be written as follows:

$$I(\xi, \eta; \lambda_s) = g(\xi, \eta) \int_{\lambda_0 - \Delta\lambda}^{\lambda_0 + \Delta\lambda} \iint O(\xi_0, \eta_0; \lambda) \mathcal{S}(\xi_0, \eta_0; \xi, \eta; \lambda - \lambda_s) d\xi_0 d\eta_0 d\lambda. \quad (4.9)$$

In order to replicate the behaviour of real instrumentation we have introduced a gain variation and cavity errors. The former is straightforward to introduce as it is considered

independently in Eq. (4.9) as a pixel-dependent multiplicative factor that affects the whole measurement,  $g$ . In contrast, the effects of the cavity map are more convoluted. Pixel-to-pixel variations in etalon defects shift the transmission profile of the FPI and must be accounted for when computing the imaging response. Both the gain and cavity map introduced in the simulations have been selected to resemble the real-case scenario of the SO/PHI instrument. The gain map (Fig. 4.3 top right panel) utilized in the simulations is derived from a flat field of the SO/PHI-HRT instrument, and the cavity map employed (Fig. 4.3 top central panel) is sourced from the cavity map of PHI's etalon.

We see from equation (4.9) that the FPI's imaging response,  $\mathcal{S}$ , has to be computed for every wavelength and every pixel, since the cavity error varies along the FoV. This is achieved by solving the integrals in equation (4.2) via numerical methods, since we will account for the PSF in these simulations. Consequently, the computational burden is significant, as the integrals must be evaluated  $N_{pixel}^2 N_\lambda N_{mods} N_{etalons} N_{cavities} > 2 \times 10^8$  times<sup>†</sup> for both sunspot and flat field observations. This extensive computation results in excessively long simulation times. To address this issue, a neural network was developed to reduce the computational time from 12 s to 5 ms, more than a factor  $2 \times 10^3$  faster, before applying parallelization techniques which will increase the factor to values higher than  $10^5$ .

The neural network is an implicit neural representation with periodic activation functions (SIREN; Sitzmann et al. 2020) trained by A. Asensio Ramos with solutions to the integrals for a fixed set of etalon parameters, namely, spectral ranges, angles of incidence and reflectivity. The solutions provided by the network are accurate up to a 1% for the etalon parameters within the training set.

#### 4.2.2.1 Flat-field observation simulation.

As with real observations, sunspot observations have to be flat-fielded before scientific analysis in order to correct for the effects of the gain and, in principle, of the cavity error. In order to reproduce this, we are required to simulate the flat-field observations as well. In real operations, flat-fields are but another set of observations, sharing similar properties in terms of spectral sampling and modulation schemes but target a uniform, structure-free region. To create these observations, we applied the same observation procedure used for the sunspot data to a simulated ideal flat region. This target was generated by averaging the spectral profile of a quiet Sun region from the simulation and replicating it across the entire FoV, producing a completely homogeneous flat-field where every pixel reproduces the quiet Sun's average spectral profile.

Since the main goal of these tests is to assess the impact of incomplete corrections of the cavity map, we conducted all simulations under two scenarios: one incorporating the cavity error and another assuming a defect-free etalon. The latter will serve us as a reference of an observation devoid from any etalon-induced defect, but with identical spectral and spatial degradations.

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<sup>†</sup> $N_{pixels} = 561, N_\lambda = 45, N_{mods} = 4, N_{etalons} = 2, N_{cavities} = 2$

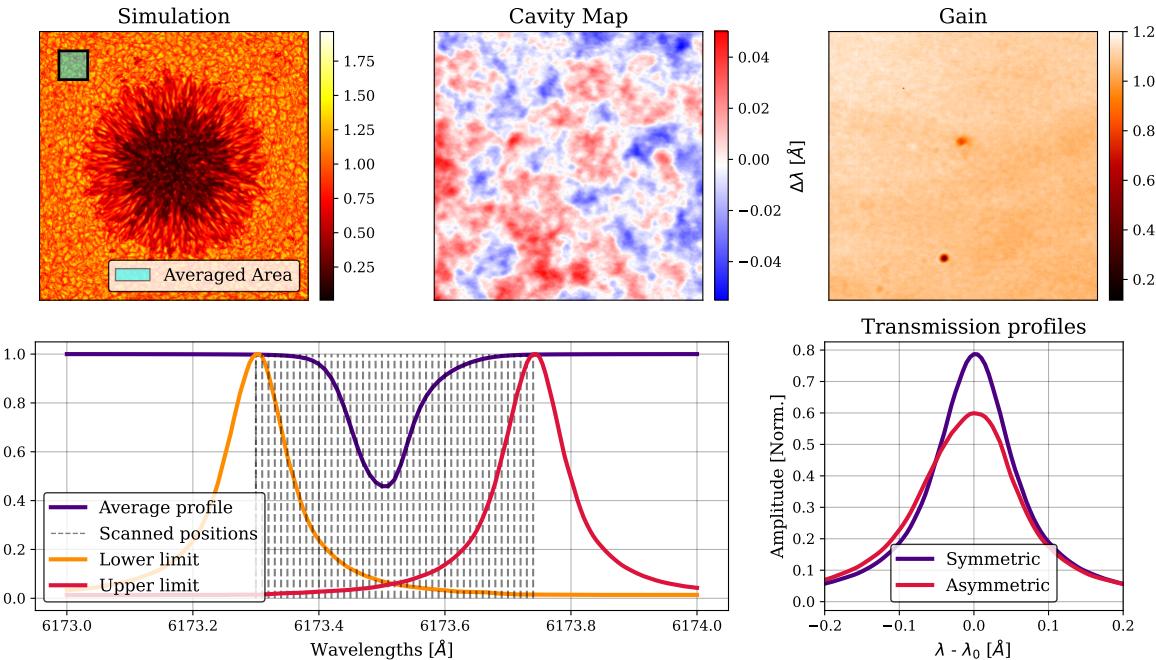


Figure 4.3 Inputs for the simulation of the sunspot observation. The top row shows, from left to right, the continuum of the MHD simulation, the cavity map expressed as the corresponding shift in Å and the gain map. The bottom row shows, again from left to right, a representation of the quiet-sun average profile with all the scanned wavelengths, and the transmission profile of the two different FPI configurations, the symmetric (perfect telecentric) and asymmetric (imperfect telecentric). The parameters employed for the etalon are:  $R = 0.892$ ,  $n = 2.3268$ ,  $d = 281 \mu\text{m}$ ,  $f = 60$ ,  $\Theta = 0^\circ$  (symmetric),  $\Theta = 0.5^\circ$  (asymmetric).

#### 4.2.3 Flat-field correction.

In principle, any flat-field correction should be straightforward as long as the flat-field information is not altered during the science observation. In the first place, the spectral line information has to be removed from the flat-field observations. To do this, a region of the flat is chosen and each of the wavelengths is normalized to the average of the flat observation in that region. This removes the spectral line contribution to the flat. Then, the observations for all tuned wavelengths are divided by the corresponding normalized flat field. However, in telecentric setups, this process is challenging because flat-field observations are influenced differently from the observations by cavity errors because the illumination (telecentric) on the etalon is different. This is clearly seen in equation Eq- (4.9) where the response depends on the object O. Hence, the flatfielding can introduce additional artifacts into the measurements rather than (or in addition to) correcting them.

Figure 4.4 shows an image of the normalized flat-field at the line's core with and without taking into account the effects of the cavity map and the adverse effects it introduces when normalizing the flats to remove the spectral line. In the left panel one can clearly see the spatial structuring of the flat. Being constant for each wavelength (because it has

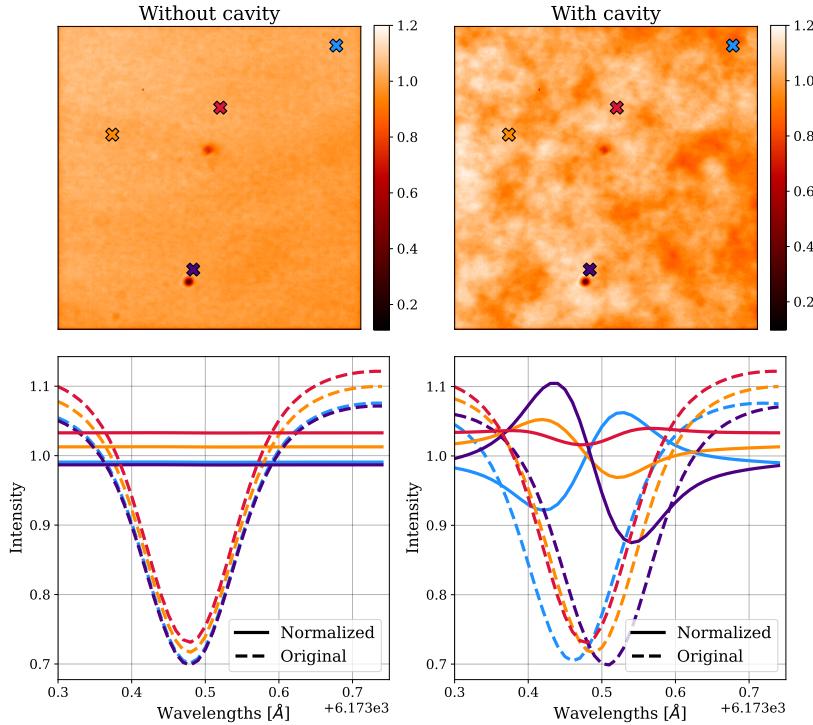


Figure 4.4 The top row shows the observed flat-fields at the core of the line for both the simulations without (left) and with (right) cavity. The bottom row shows the spectral profile of the pixels marked with an "X" of the corresponding color, for both scenarios, and before and after the normalization.

no cavity effects) the normalization of the spectral lines (shown in the lower panel) is perfectly eliminated and the variation of the flat with wavelength is constant. However, the cavity map introduces a clear contamination in the flat during the normalization process. The intensity fluctuations that can be seen in the top right panel in fig 4.4 are due to the red and blue shift of the spectral line caused by the cavity map. The lower right panel shows the same profiles as in the non-cavity case. Again, the shifts due to the cavity map can be clearly seen. As we have explained before, normalizing the flat requires taking an intensity average at each wavelength. Since the flat shows imprints of the cavity, the normalized flat shows a clear intensity fluctuation on wavelength. This dependence must exist, since one of the roles of the flat is to remove the etalon contribution, but since the etalon contribution is inside the integral in equation (4.9), as we will see later, the flat is not able to entirely remove the effects of the cavity map.

The issue with the flat-field correction is illustrated in Fig. 4.5, which displays the profiles after applying the correction for both scenarios, with and without the cavity map. Ideally, if the flat-field correction effectively compensates for the FPI cavity errors, the profiles from both scenarios should be identical. However, upon comparison, significant differences emerge, particularly for pixels with high cavity map values (light blue and dark blue lines). These profiles are not only shifted but also exhibit differences in their shape.

Because of this, some data reduction pipelines adopt a different approach. Instead of using the flat-fields of the corresponding wavelengths, only the continuum flat-field is employed for the correction. When the continuum is measured sufficiently far from the spectral line, it remains unaffected by any spectral shift. By using this measurement, one can correct for spurious effects unrelated to spectral shifts, such as pixel sensitivity variations

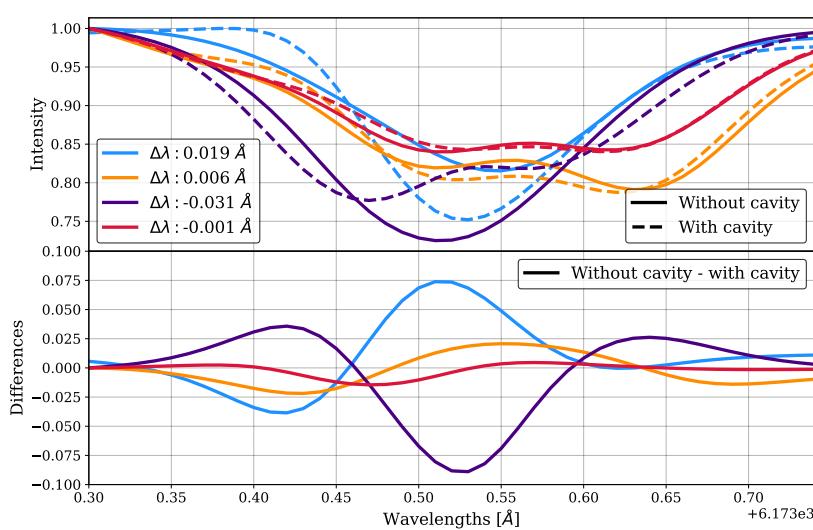


Figure 4.5 The top panel shows four spectral profiles after the flat-field correction for the two scenarios, with and without cavity, and for the symmetric FPI. The selected pixels are the same than in Fig. 4.4, and correspond to different values of the cavity map. The bottom panel shows the difference between the profiles with and without cavities.

or dust grains. However, this method does not correct for the effects of the cavity.

If the cavity map is known, the velocity associated with the spectral shift caused by the cavity can be calculated. This "velocity-error" map can then be used to correct the Doppler velocity map derived from the observations that have not been corrected for the cavity map. This approach offers a partial solution, providing only a first-order approximation for correcting the spectral shift. However, it does not address the potential impacts of the cavity map on magnetic field calculations, as the relationship between wavelength shifts and magnetic fields is more complex than it is for velocity measurements.

#### 4.2.4 Velocity maps

We begin our analysis by studying the LOS velocities and the errors associated with their computation. These velocities are derived from the spectral shift of each profile relative to the rest position of the spectral line, using the Doppler formula, eq. (1.24). Given that this computation relies exclusively on the spectral shift, it is particularly susceptible to errors caused by cavity effects.

According to the center-of-gravity method (Uitenbroek, 2003), the central wavelength of a given spectral profile,  $\lambda_{COG}$ , can be computed from:

$$\lambda_{COG} = \frac{\int \lambda (I_{cont} - I) d\lambda}{\int (I_{cont} - I) d\lambda}. \quad (4.10)$$

Once  $\lambda_{COG}$  has been determined, the spectral shift of the corresponding profile will be given by  $\Delta\lambda = \lambda_0 - \lambda_{COG}$ .

We have computed the velocities employing the two flat-field correction strategies men-

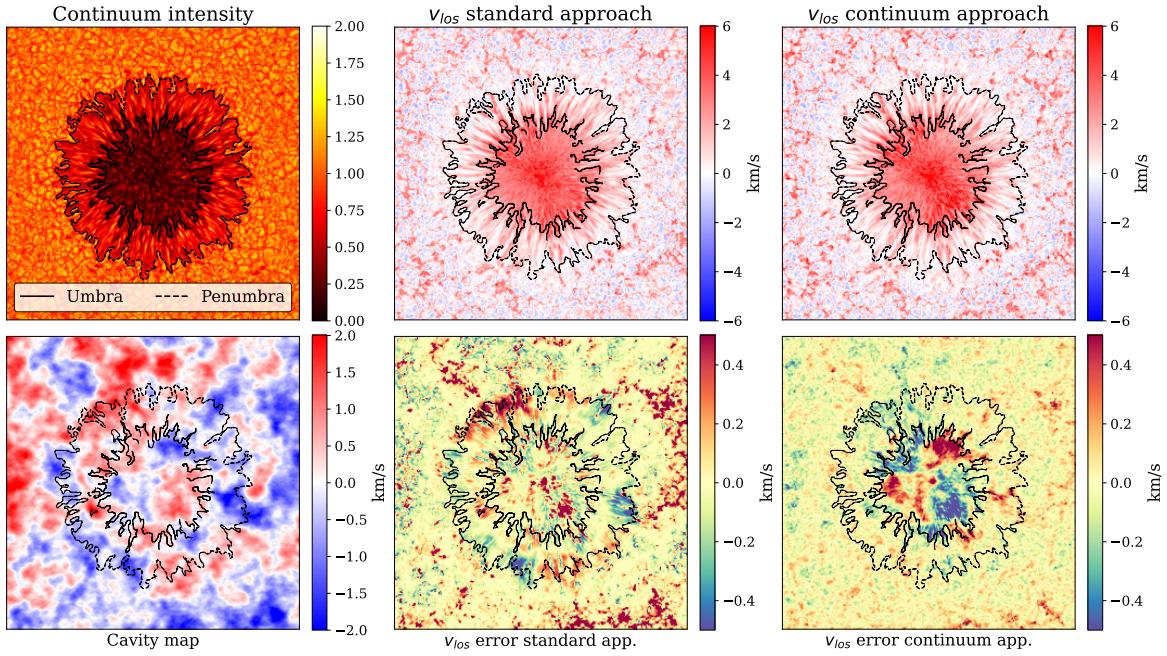


Figure 4.6 The top row shows, from left to right, the observed intensity in the continuum, the LOS velocity for the standard approach and the LOS velocity for the continuum approach, all three for the symmetric FPI and belonging to the simulations with cavity map. The bottom row shows, from left to right, the velocity error associated with the cavity map, the error for the LOS velocity for the standard approach and the error for the LOS velocity of the continuum approach. The error is computed by subtracting the measurement to the reference. All representations show the boundaries of the umbra and penumbra for an easier identification of the regions in the velocity and cavity maps.

tioned in the previous section: the "standard" approach, where each observation is corrected with the flat-field of the corresponding wavelength; and the "continuum" approach, where only the continuum flat-field is employed. The top row of figure 4.6 shows the continuum intensity and the velocity maps obtained for both strategies.

At first glance, the velocities derived for each approach look qualitatively similar, but under closer inspection, some differences exist. In order to highlight these differences and to assess their accuracy we will compare them to the velocity obtained in the scenario where no cavity map was introduced. Figure 4.6 shows this comparisons in the bottom row, along with the cavity map with the umbra and penumbra boundaries overplotted for comparison purposes.

The error in the velocity computation shows that the effects of the cavity map remain uncorrected in the observations. Both correction approaches exhibit errors with structures corresponding to the cavity map. For the standard correction, this effect is pervasive throughout the field of view (FoV), whereas for the continuum approach, it is primarily concentrated in the umbra, although other regions also exhibit this behavior.

Moreover, the errors are significant, given that regions of the penumbra show errors of

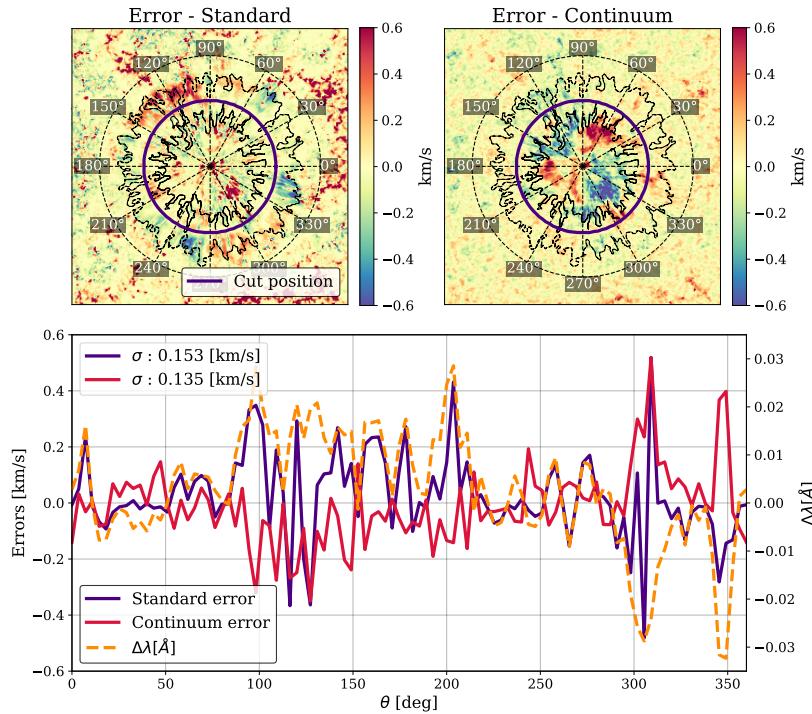


Figure 4.7 The top row shows the velocity error maps for both the standard and continuum approaches, along with the cut position and an overlay of the degrees for easier interpretation of the plotted profiles. The bottom panel shows the velocities along the cut for both approaches along with the value of the cavity map at the corresponding position.

around 10%. Errors in the umbra are similarly significant in percentage terms, if not worse; however, studies of these regions are less frequent due to their low S/N resulting from their inherent darkness. Conversely, as discussed in the introduction, penumbral flows are of particular interest, prompting us to prioritize our discussion on the results in that area. Outside the umbra, the velocities are generally underestimated for pixels affected from a blueshift displacement due to the cavity, and overestimated for redshifts, resulting in an error pattern that follows that of the cavity map. The general performance of the correction is worse when employing the standard approach versus the continuum strategy. Except for the umbra, where this behavior is reversed.

A more quantitative analysis is shown in Fig. 4.7, where the velocity error along a circular path is shown, for both approaches, in addition to the associated spectral shift of the cavity values at identical positions. In the figure it can be seen how there is no strong correlation between the cavity map and the errors in the velocities in both cases, taking into account all wavelengths or only the continuum. In the first case, there is some correlation but it is not significant.

Some pipelines address cavity-map issues by attempting to "deconvolve" the etalon's transmission profile from the flat-field observations. However, it is common practice to overlook the asymmetric nature of real telecentric mounts due to the complexity of the analytical equations involved, and because the potential effects of profile asymmetries are often assumed to be negligible.

In an attempt to quantify the error of this assumptions, we now compare the results obtained with the asymmetric and symmetric profiles. The main effect of the asymmetry is a systematic shift of the profile measurements towards the blue. This shift results in an

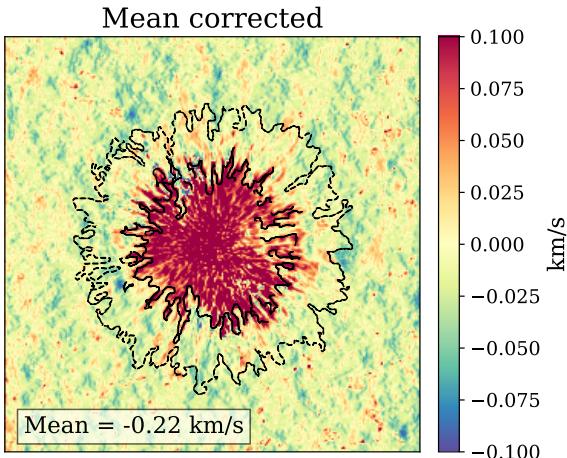


Figure 4.8 Difference in LOS velocities between the symmetric and asymmetric FPIs (symmetric - asymmetric). The mean value of the difference has been subtracted for the whole FoV.

average difference of around  $-0.2 \text{ km s}^{-1}$  that can be seen over the whole FoV.

Nevertheless, this systematic shift can be removed from the velocities computed with the asymmetric FPI by subtracting the average difference between symmetric and asymmetric velocities. Figure 4.8 depicts the differences in the computed velocities for the symmetric and asymmetric FPIs, after applying this correction. Despite accounting for the systematic shift, discrepancies are still present, predominantly within the umbra, although they are observed across the entire FoV. The umbra is again more sensible than other regions, with velocity discrepancies higher than  $100 \text{ m s}^{-1}$  throughout the majority of the umbra, and exhibiting a global shift towards smaller velocities for the asymmetric scenario. Outside the umbra, differences are smaller but still prevalent throughout the entire FoV.

The fact that the umbra exhibits different behaviors compared to the rest of the FoV, along with the difference between the two types of FPIs, suggests that the amplitude and behavior of these effects are very sensitive to the shape of the observed spectral profile and the FPI's transmission profile, as expected from the dependence observed in the equations (see. eq.(4.9)).

#### 4.2.5 Magnetic field maps.

It is expected that cavity errors significantly impact velocity calculations, as these are derived solely from the analysis of spectral shifts. However, the effect of these errors on the calculation of the magnetic field is not as straightforward as its determination involves not only the spectroscopy, but also polarization.

To calculate  $B_{LOS}$ , we need to determine the circularly polarized component of the light. This requires demodulating the simulated observation using a process analogous to that described in the TuMag pipeline. Once the Stokes components have been determined, the LOS component of the magnetic field is computed using the center-of-gravity method (eq. (1.25)).

Figure 4.9 shows the LOS component of the magnetic field for the simulation with no cavity (the one employed as reference) and the errors in its calculation for both flat-fielding

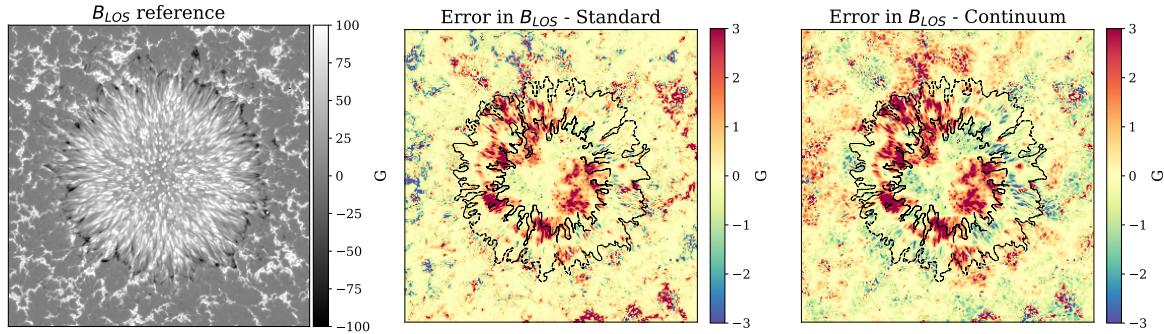


Figure 4.9 From left to right,  $B_{LOS}$  for the simulation with no cavity and a symmetric FPI, error in  $B_{LOS}$  computation for the standard approach with a symmetric FPI, and error in  $B_{LOS}$  computation for the continuum approach with a symmetric FPI.

approaches. In the continuum approach, the structures observed in the error map closely resemble those in the cavity map. This similarity is expected since no correction has been applied to account for the cavity error. While it is possible to compute the velocities associated with the spectral shift caused by the cavity map, this is not feasible for the magnetic field. Consequently, any effect of the cavity remains in the data when using the continuum approach.

As a result, errors in the magnetic field computation appear larger or more prevalent across the entire field of view (FoV) for the continuum approach. However, for both correction strategies, the errors remain relatively small, reaching values of approximately 3 G, compared to magnetic field signals of around  $\pm 100$  G. Although small, these residues of the cavity map in the magnetic field maps are one of the main problems of employing the continuum approach in real data.

### 4.3 Fitting algorithm

Results from the sunspot observation simulation highlight the relevance of carefully addressing the data correction of FPI-based instruments. Although some pipelines address these deviations by correcting them only at first order through a regular flat-fielding procedure with no further computations, the residues left in the data can lead to errors as high as those shown in the previous section, depending on the FPI's properties. For this reason, different approaches have been taken to address these additional corrections. Typically, each instrument has a specific data reduction pipeline where the corrections are carried out taking into account the individual properties of the instruments, hence giving rise to different methods. An example of a more detailed calibration pipeline can be found in Schnerr et al. (2011). By using a simplified analytical expression for the etalon transmission profile, Schnerr et al. were able to extract from the flat fields the contributions caused by the FPI cavity errors and variations in reflectivity for the CRISP instrument, which are then taken into account in the data calibration.

For the first order, this is a good approximation, but since asymmetries in the transmission profiles naturally arise in telecentric instruments (Bailén et al., 2019a), deviations originating from them cannot be fully corrected. Thus, knowledge of the exact shape of the transmission profile is necessary to fully account for these deviations. Scharmer et al. (2013) already allowed asymmetries to be dealt with in the pipeline of the CRISP instrument, but the asymmetries originated from wavelength shifts induced by two distinct etalons, or from an angular dependence along the FoV introduced to approximate the behavior in telecentric setups.

We aim to further extend and generalize the strategy employed in Schnerr et al. (2011) and Scharmer et al. (2013) by including the exact shape of the transmission profile for the telecentric configuration in the analysis. By doing so, we can fit and take into account the presence of asymmetries in the profile that arise in these setups due to an asymmetric pupil apodization. We have developed a method for deriving the etalon properties from the data in such a way that prior knowledge of the distribution and magnitude of the defects is not needed. We do not make any distinction between defects associated with the mirror's flatness or separation, refraction index, or cavities. This way, we ensure the applicability of the algorithm to all types of FPIs (air and solid). Our technique also differentiates the effects associated with the etalon from other corrections not related to it, such as pixel-to-pixel variations of the gain across the detector. By comparing the theoretical prediction, obtained through the analytical expressions of the transmission profile, with the measured data, we can disentangle the etalon properties from the flat-field observations.

In this section, we introduce the algorithm and evaluate its performance. We begin by outlining the approximations made and detailing the algorithm in Sections 4.3.1 and 4.3.2, respectively. The method was tested on a series of simulated observations with controlled configurations to evaluate the impact of different observational properties on the accuracy of the results. Finally, the algorithm was applied to a dataset from the HRT telescope of the SO/PHI instrument to assess its performance in real scenarios. The results for both the simulated scenarios and real data are discussed in Section 4.3.3.

### 4.3.1 Initial approximations and observations simulation.

As initial approximations, we will adopt the same assumption regarding the prefilter as the one employed for the sunspot simulation; specifically, that it has a rectangular shape with a width such that only one order of the etalon is let through. Additionally, we will disregard the spatial PSF of the FPI and assume that the spatial dependence can be represented by a Dirac delta function to simplify the equations. Therefore, if we assume that the image response of the FPI follows the expression:

$$S(\xi_0, \eta_0; \xi, \eta; \lambda - \lambda_s) = \delta(\xi_0 - \xi, \eta_0 - \eta) \Psi(\xi, \eta; \lambda - \lambda_s), \quad (4.11)$$

equation (4.9) simplifies into:

$$I(\xi, \eta; \lambda_s) = g(\xi, \eta) \int_{\lambda_0 - \Delta\lambda}^{\lambda_0 + \Delta\lambda} O(\xi, \eta; \lambda) \Psi(\xi, \eta; \lambda - \lambda_s) d\lambda. \quad (4.12)$$

The explicit shape of  $\Psi$  varies depending on the optical configuration of the instrument, whether collimated or telecentric. In particular, we will employ three types of transmission profiles: one for the collimated configuration, one for a perfect telecentric setup (normal incidence), and one for an imperfect telecentric setup. The first two have analytical expressions for the transmission profile in the absence of the spatial PSF, as detailed in Sections 4.1.1 and 4.1.2, respectively. For the imperfect telecentric configuration, the transmission profile must be determined numerically (see Section 4.1.2.1).

We have tested the performance of the algorithm on a series of simulations of a spectral line observation in different conditions. We used the Kitt Peak FTS-Spectral-Atlas as the reference (Brault & Neckel, 1987) and, specifically, the Fe I spectral line at 6173.3 Å. Each observation was composed of  $N_\lambda$  wavelengths, where the measured intensity was recorded. At every wavelength  $\lambda_s$ , the corresponding transmission profile of the etalon  $\Psi^{\lambda_s}$  was computed, and the "observed" intensity  $I_{\text{obs},i}^{\lambda_s}$  corresponding to a specific spatial location  $(\xi, \eta)$ , represented hereinafter by the pixel  $i$ , was calculated using Eq. (4.12). Additionally, we took into account the presence of additive Gaussian noise. This noise does not necessarily respond to any parameter fluctuation within our analytical expressions or photon noise but comes from any unexpected variations that may not have been modeled in the theoretical scheme.

Additionally, we included the presence of defects arising from irregularities or inhomogeneities on either the cavity thickness  $d$ , the refractive index  $n$ , or from deviations of the angle of incidence  $\theta$ . In order to simulate this, we introduced a relative perturbation  $\Delta a$  into the etalon equation that accounts for any local deviation of the value of  $a$  with respect to its nominal value. This parameter changes from pixel to pixel differently for the collimated and telecentric configurations. In the former, the profile shifts across the FoV only because of the different incidence angles of the light beam on the etalon. In the latter, local variations of  $n$  and/or  $d$  are mapped directly onto the detector. We also note that variations in the incidence angle must be considered as well when the degree of telecentrism varies along the detector. Analytically, the parameter  $a$  at each  $i$ -th pixel is given by  $a'_i = a\Delta a_i$ , where  $a = (2\pi/\lambda)nd \cos \theta$  is constant along the FoV. Note that rewriting the equations for the transmission profiles (sections 4.1.1 and 4.1.2) using this definition of  $a$  is straightforward. In collimated configurations, the parameter  $\delta$  (eq. (4.4)) is simply  $2a$ . In perfect telecentric configurations,  $\theta$  is always 0, so the given transmission profile is already expressed in terms of  $a$ .

We let  $n_i^{\lambda_s}$  be the noise contribution at the  $i$ -th pixel and wavelength  $\lambda_s$ . Thus, the observed intensity at that pixel when the etalon is tuned at  $\lambda_s$ ,  $I_{\text{obs},i}^{\lambda_s}$  is given by

$$I_{\text{obs},i}^{\lambda_s} = g_i \frac{\int_{\lambda_0-\Delta\lambda}^{\lambda_0+\Delta\lambda} O(\lambda)\Psi^{\lambda_s}(\lambda, \Delta a_i)d\lambda}{\int_{\lambda_0-\Delta\lambda}^{\lambda_0+\Delta\lambda} O(\lambda)\Psi^{\lambda_c}(\lambda, \Delta a_i)d\lambda} + n_i^{\lambda_s}, \quad (4.13)$$

with  $\lambda_c$  being the continuum wavelength. From a practical point of view, the integration limits are set in such a way that only a single resonance (or order) of the etalon is included with the limits, thus, acting akin to the sorting pre-filter commented on previously. We

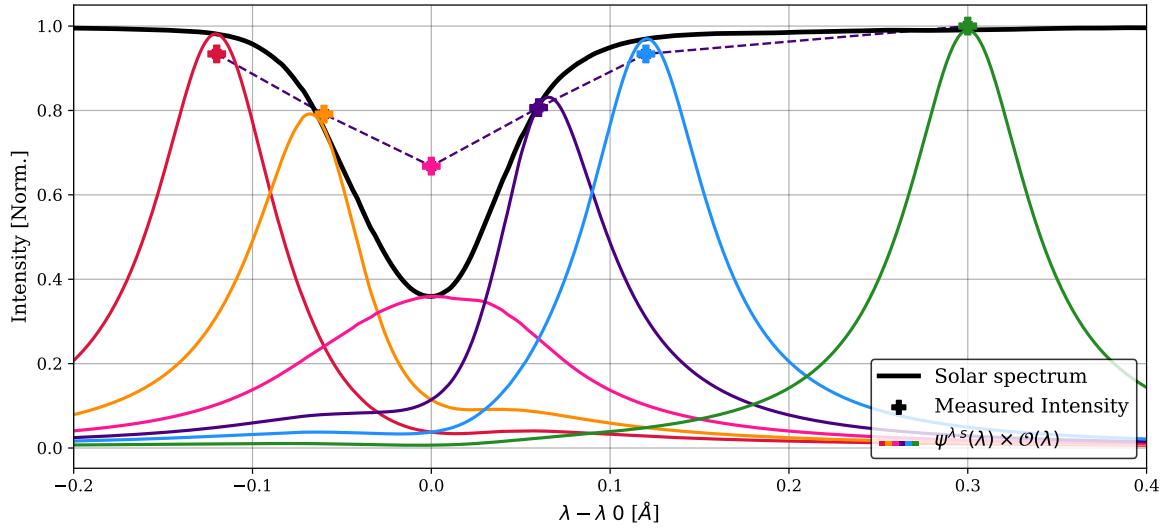


Figure 4.10 Simulated observation of the Fe I spectral line ( $\lambda_0 = 6173.3\text{\AA}$ ) using a collimated mount and a total of  $N_\lambda = 6$  wavelengths that have been equally distributed along the spectral line, with the exception of the continuum measurement (light blue), which is selected at 300 m\AA from the blue of the line core. The measured intensity is the result of computing the value given by Eq. 4.13 at each wavelength and with  $g = 1$ .

note that the denominator strictly corresponds to the intensity at the continuum of the line in the absence of the transmission profile or if the continuum wavelength is far enough from the spectral line. In any other case, the transmission should be taken into account as well to normalize the observations to the local continuum, which is necessary since we work with relative measurements. An example of a spectral line measurement is displayed in Fig. 4.10.

For both the collimated and telecentric configurations, we modeled etalon and gain imperfections over a  $100 \times 100 \text{ px}^2$  image. Pixel-to-pixel variations in the sensor efficiency were modeled following a random spatial distribution, as shown in Fig. 4.11 (left panel). Additionally, we included a set of pixels with very low gain values, which represent a group of dead pixels or dust grains.

We modeled the etalon defects as changes in  $\Delta a$  in such a way that the maximum displacement reaches 3 pm. The spatial distribution of the values of  $\Delta a$  follows an increasing radial distribution, as shown in Fig. 4.11 (right panel). Such a spatial distribution coincides with the expected one in collimated etalons due to the change in the incidence angle across the FoV. Telecentric mounts do not exhibit a spatial distribution of their defects such as this, but using the same spatial distribution in the two cases allowed us to compare the performance of the method for both setups in a systematic way. Since  $\Delta a$  accounts for relative perturbations, it is by definition an adimensional parameter. However, to grant it a physical meaning, we express the values of  $\Delta a$  in \AA, representing the associated shift of the transmission profile with respect to the original position determined by  $a$ .

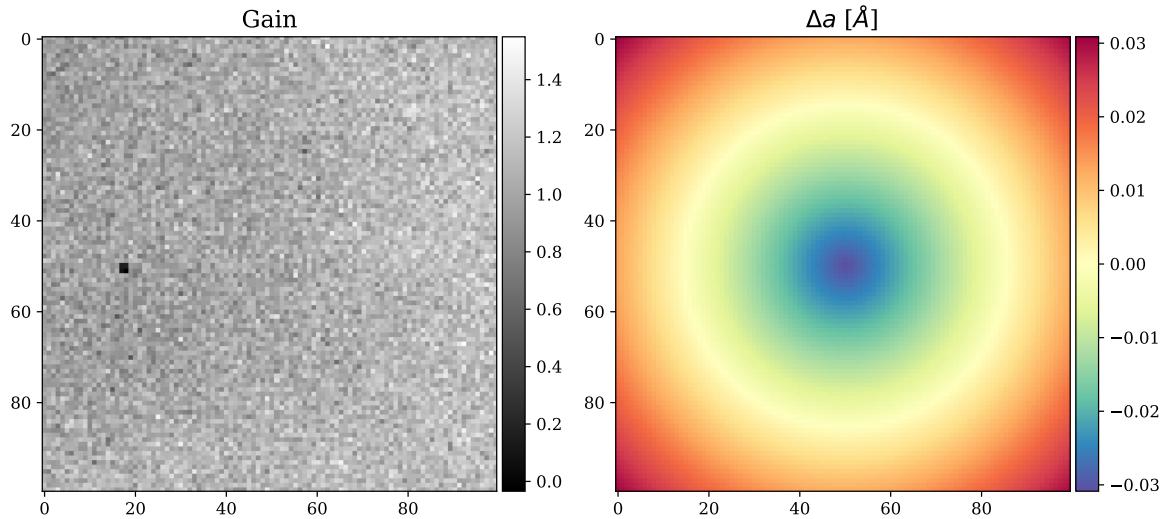


Figure 4.11 Input maps introduced when simulating the observations. The left panel represents the gain generated as white Gaussian noise, with values ranging from 0.8 to 1.2. A dust speck was introduced by creating a group of four pixels with low values of  $g = 0.2$  for the gain. The right panel shows the spatial distribution of the defects in the etalon. The distribution follows a radial pattern starting from the center of the FoV. The defects vary from 0 % deviation to up to  $5 \times 10^{-4}$  %, which corresponds to a shift of 3 pm. Both possible directions for the deviations have been considered. The sign of the deviation is negative at the very center, which introduces a redshift, while it is positive at the corners, causing a shift of the profile into the blue.

### 4.3.2 Fitting algorithm

We have developed an algorithm able to extract the distribution of the etalon defects and the gain map from data taken by etalon-based instruments, which enables the correction of the two contributions separately. The algorithm works by minimizing a given merit function that depends on the gain and the etalon defects.

In particular, we have defined an error metric,  $\varepsilon^\lambda$ , at each tuned wavelength, computed by comparing the measured intensity with the theoretical prediction. If we let  $I_{i,\text{obs}}^{\lambda_s}$  be the measured intensity at a given  $i$  pixel for an etalon tuned to the wavelength  $\lambda_s$ , the error metric at each wavelength is given by

$$\varepsilon^{\lambda_s}(\Delta a_i, g_i) = I_{i,\text{obs}}^{\lambda_s} - g_i \frac{\int_{\lambda_p}^{\lambda_q} O(\lambda) \Psi^{\lambda_s}(\lambda, \Delta a_i) d\lambda}{\int_{\lambda_p}^{\lambda_q} O(\lambda) \Psi^{\lambda_c}(\lambda, \Delta a_i) d\lambda}. \quad (4.14)$$

The merit function we employed is then the quadratic summation of the error metric over all tuned wavelengths:

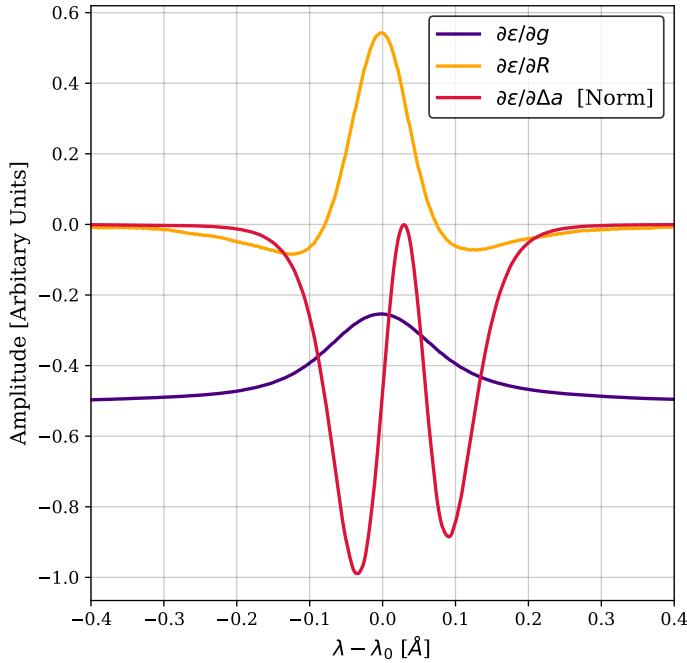


Figure 4.12 Derivatives of the error metric as a function of wavelength. The derivative with respect to  $\Delta a$  has been normalized in order to fit the three curves in the same plot.

$$f(\Delta a_i, g_i) = \sum_{s=0}^{N_\lambda} \left( \varepsilon^{\lambda_s}(\Delta a_i, g_i) \right)^2. \quad (4.15)$$

Both the camera gain and the defects of the etalon change from one pixel to another, which is why we address each pixel independently, but they remain constant at every wavelength. Hence, the transmission profile of the etalon varies at different points of the FoV; but at a given pixel, it is constant at all tuned wavelengths. Therefore, the algorithm is able to better obtain the etalon properties as we increase the number of wavelengths.

Figure 4.12 shows the derivatives of the error metric, Eq. (4.14), as a function of wavelength, that is, before computing the summation over  $s$  of the merit function, with respect to the gain, the reflectivity, and  $\Delta a$ . The curve corresponding to the  $\Delta a$  derivative is different from the others, whereas the derivatives of both the gain and the reflectivity exhibit similar shapes. Hence, variations in either the reflectivity or the gain introduce similar changes in the merit function, which can produce a trade-off between these two parameters, especially when the spectral line is sampled in only a few points. Given that discrepancies arising from errors in reflectivity are assimilated by gain maps, we did not take into account reflectivity errors when computing our simulations, as they have no impact on cavity map calculations.

A few key aspects arise when analyzing the merit function and its applicability on real data. The first point to bear in mind is that the shape of the object,  $O(\lambda)$ , is not known a priori. Therefore, we needed to provide a guess for it. The method works by assuming that differences between the prediction and the observation are caused exclusively by the etalon defects or the gain. If the object used during the fitting process differs considerably from the real one, the prediction and observation will have differences that will erroneously

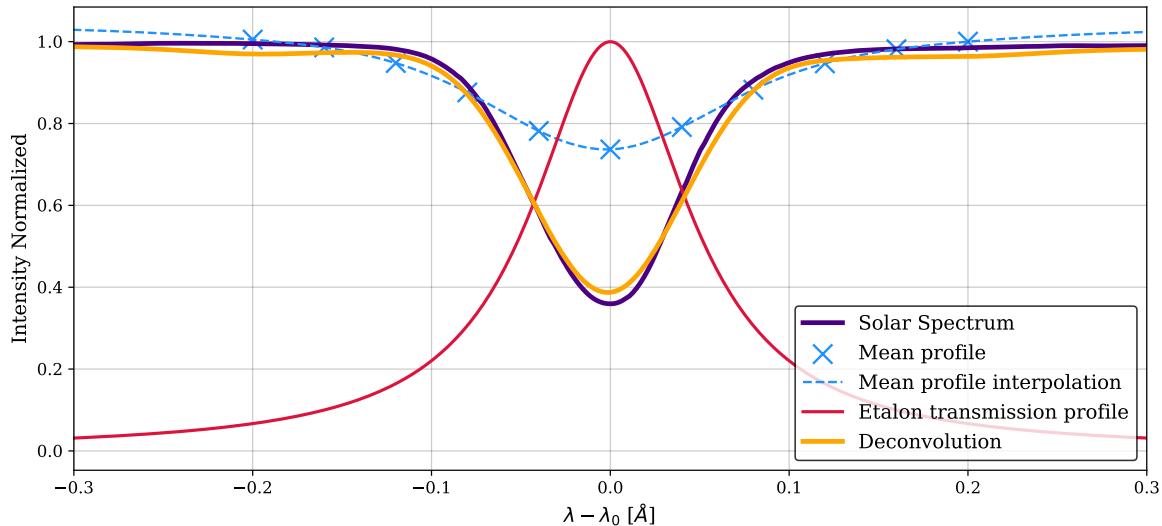


Figure 4.13 Deconvolution of the object with a measurement of the Fe I spectral line using  $N_\lambda = 9$ . All points of the FoV have been used to compute the average profiles (blue crosses). The deconvolution (orange) is the result of deconvolving the mean profile interpolation (dashed line) with the displayed etalon transmission profile (red).

be identified as etalon defects or gain variations. This is the main source of errors for the method when applied to real data. Two approaches can be followed in order to address this issue. The first one consists of assuming the solar atlas profile as the object. This is a good approximation, provided the data to which the algorithm is applied to lack information about solar structure, either because they are observations of long integration times of the quiet sun or produced by averaging several quiet sun observations (flat fields). If this condition cannot be met, this approach is not valid. The second approach involves deriving an approximated object from the data themselves by deconvolving the mean profile of the observation with the etalon's transmission profile. This approach can account for any difference the real object may have with the solar atlas and thus has a greater resemblance to the real object. Nevertheless, the process of deconvolving is prone to errors when the sampling is insufficient and can introduce additional noise into the problem. We have tested both approaches to compare their performances on different scenarios in order to assess when to use one or the other.

We employed Newton's method to minimize the merit function, Eq. (4.15), as it has been proven to quickly converge (in five iterations or fewer, usually). The method begins by assuming an initial guess for the gain  $g_j$  and  $\Delta a_j$  parameters. Then, provided the initial guess is sufficiently close to the solution and that the merit function is continuous and differentiable, the gain  $g_j$  and  $\Delta a_j$  encoded in the vector,  $\mathbf{x}_j$ , can be updated iteratively at each iteration,  $j$ , as

$$\mathbf{x}_{j+1} = \mathbf{x}_j - \mathcal{H}^{-1} \mathcal{J}^T f(\mathbf{x}_j) , \quad (4.16)$$

where  $\mathcal{H}$  and  $\mathcal{J}$  are the Hessian and Jacobian matrices of the merit function  $f$ , respec-

tively, calculated for  $\mathbf{x}_j = [g_j, \Delta g_j]^T$ , and  $T$  stands for the transpose. Hence, the transmission profile of the etalon and its derivatives have to be computed for every wavelength and every pixel at each iteration. This can be computationally costly, especially when using imperfect telecentric configurations, where numerical integrals are involved. All derivatives needed for the algorithm are calculated analytically, except when simulating imperfect telecentrism. A detailed formulation of these derivatives is provided in the appendix.

Regarding the object  $O(\lambda)$ , if we assume it is given by the solar atlas, no additional computations are needed. However, when using the deconvolution approach, the object has to be calculated in each iteration. In this case, the algorithm works as follows: First, we compute the average profile across the whole FoV, and we force the continuum intensity to be the same on both sides of the spectral range to reduce the boundary effects of the deconvolution. This step is only necessary in case the spectral line is sampled in only a few positions, as is the case of the SO/PHI, IMaX, or TuMag instruments, where only a continuum point, either at the red or the blue side of the spectrum, is recorded. Both the object and transmission profile require a good spectral sampling to accurately compute the integrals of Eq. (4.14). Second, a cubic spline interpolation is applied to the generated average profile to artificially improve the spectral sampling, if necessary. Finally, the interpolated profile is then deconvolved by means of a Wiener filter with the etalon's transmission profile. The result of this deconvolution is the object,  $O(\lambda)$ , used in the minimization algorithm. The deconvolution of the object is done every time the etalon defects are updated in order to improve the resemblance of the deconvolved object to the real one. Figure 4.13 shows an example of this process in a simulated observation using nine scanned points and a collimated configuration. The deconvolution manages to reproduce the original signal, with only some minor differences in the line core and the beginning of the wings.

### 4.3.3 Test scenarios and results

The aim of the simulations carried out in this section was to characterize the role of the noise  $\delta_i^{\lambda_s}$ , the spectral sampling, the selection of the object  $O(\lambda)$ , and the accuracy of the method for both the collimated and telecentric configurations. All simulations were run for different choices of the number of scanned wavelengths, ranging from  $N_\lambda = 5$  to  $N_\lambda = 21$ .

#### 4.3.3.1 Impact of the noise level

We first assumed that the spectrum of the observed object is given by the solar atlas. This way, all errors in the derivation of the gain and etalon defects only come from the noise introduced into the measurement. We refer to this as the "ideal case." Since we were combining different measurements taken at different wavelengths, we considered a worst-case scenario and simulated three different S/N: 100, 150, and 200.

We restricted imperfections in the telecentrism to arise only for one scenario, S/N = 200, since simulating imperfections requires a high computational effort due to the lack of a theoretical expression for both the transmission profile and its derivatives. We also assumed that the degree of telecentrism ( $0.3^\circ$ ) is known in this case.

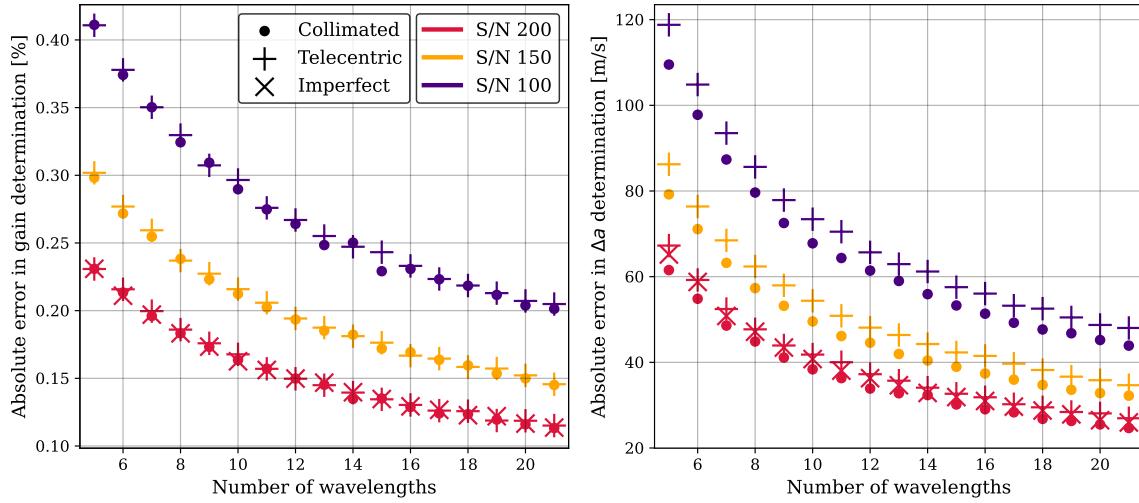


Figure 4.14 Absolute errors of the gain (left) and etalon defect (right) derivations averaged over all the FoV. The number of wavelengths corresponds to the parameter  $N_\lambda$  of wavelengths used to scan the profile.

Figure 4.14 shows the average absolute error in  $g$  (left panel) and in  $\Delta a$  (right panel) over the whole FoV as a function of the wavelength sampling,  $N_\lambda$ . The error in  $g$  is expressed as a percentage of its real value. Errors in  $\Delta a$  are given in meters per second since they are mostly responsible for shifting the profile. Errors in  $\Delta a$  can be translated into velocity errors by computing the doppler velocity (Eq. (1.24)) associated to the spectral shift of the transmission peak produce by the error in  $\Delta a$ .

All the scenarios exhibit a similar behavior as far as their dependence on the spectral sampling is concerned, namely, the absolute errors decrease monotonically when the wavelength sampling increases. The reason for this is simply that a larger number of wavelength samples increases the amount of available information that the algorithm can use, thus making the fitting for  $g$  and  $\Delta a$  more precise. These results highlight the importance of properly sampling the targeted spectral line. A modest sampling of only  $N_\lambda = 5$  can produce errors as large as  $120 \text{ ms}^{-1}$  in the worst-case scenario ( $S/N = 100$ ).

The noise level also plays an important role in the accuracy of the results. Scenarios with a lower S/N always have larger errors, for a given  $N_\lambda$ , in both the gain and  $\Delta a$  computations. The difference in the performance of the algorithm due to the noise also changes with the spectral sampling; scenarios with a poor spectral sampling suffer from larger differences in the accuracy between the different S/N ( $50 \text{ ms}^{-1}$  for  $N_\lambda = 5$  between S/N = 200 and S/N = 100) than those with higher samplings ( $35 \text{ ms}^{-1}$  for  $N_\lambda = 21$ ).

The optical configuration of the etalon has a very small impact on the accuracy of the algorithm. Results for the three setups are very similar, particularly in the gain calculation, for which the results are almost identical for all configurations. Retrieval of  $\Delta a$  is slightly better for the collimated mount, though.

Figure 4.15 shows the spatial distribution of the errors in the retrieval of  $\Delta a$  for differ-

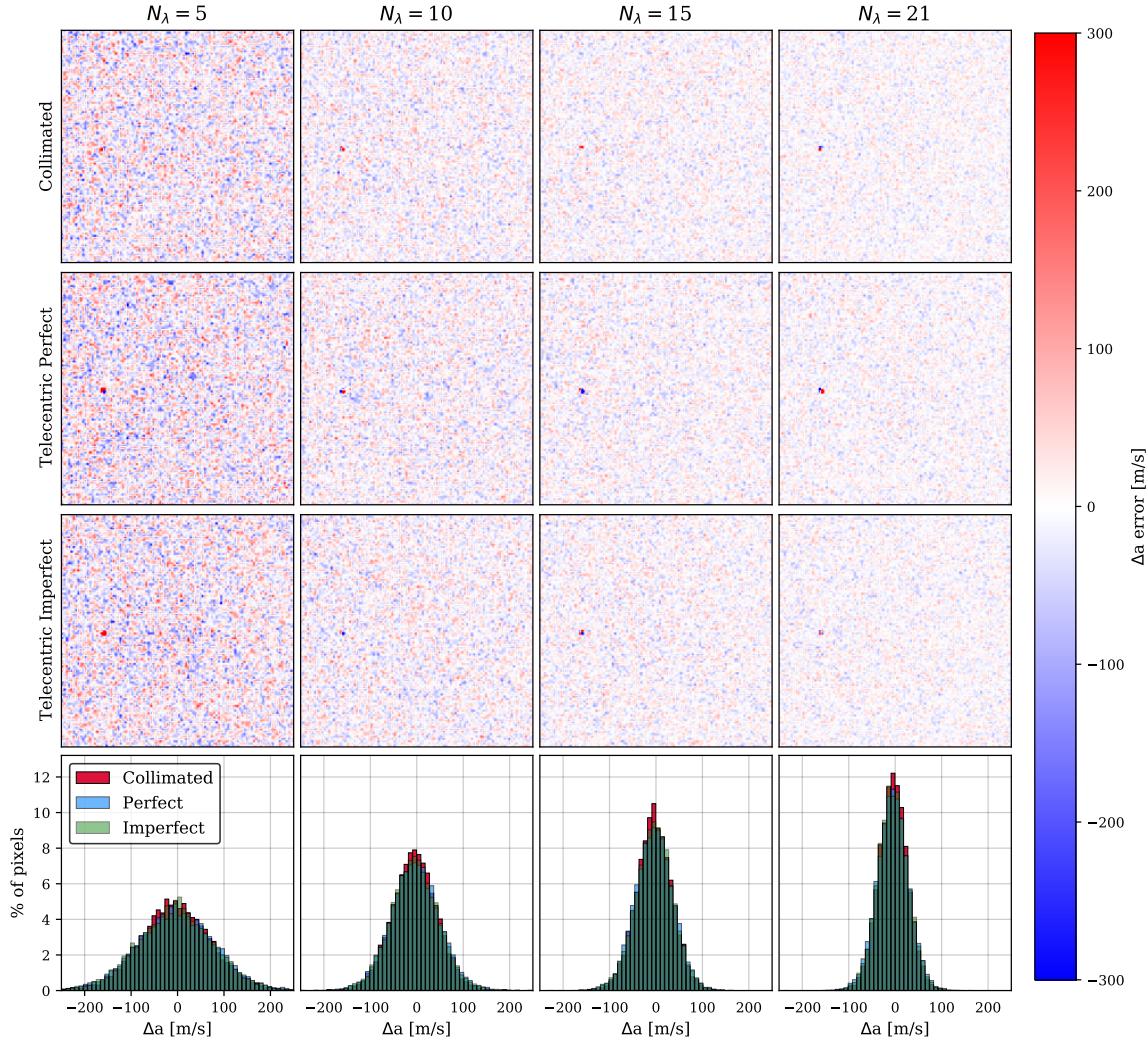


Figure 4.15 Distribution of the errors in the  $\Delta a$  computation for the three configurations (first three rows) and different spectral samplings (columns). In the bottom panels of each column, the error distribution for the corresponding spectral sampling is shown for the three configurations.

ent choices of  $N_\lambda$ . There are no signs of a radial distribution in the maps shown in the figure, contrary to the actual distribution of the  $\Delta a$  parameter, as shown in Fig. 4.11, right panel. This means that the precision of the method is similar no matter the amplitude of the defects, that is, we achieve the same accuracy in the retrieval of defects associated with shifts of 3 pm ( $\sim 1450 \text{ ms}^{-1}$ , near the corners of our FoV), which correspond to cavity errors of around 1.5 nm or incidence angles of approximately 0.4 degrees, and in the retrieval of regions where no defect is present (radius of 20 pixels from the center of the FoV approximately). Instead of a radial distribution, the errors follow a Gaussian-like distribution (shown at the bottom panels in 4.15) similar to the one followed by the noise contribution.

The standard deviation of the errors for both the gain and  $\Delta a$  computations are also reduced with an increase in spectral sampling. The last row of Fig. 4.15 displays the error distributions in the calculation of  $\Delta a$  for the three optical configurations and different spectral samplings. These results illustrate how the three configurations yield practically identical results and how the distribution narrows as  $N_\lambda$  increases, thereby improving the results. Specifically, the standard deviation decreases from  $50 \text{ ms}^{-1}$  for  $N_\lambda = 5$  to  $20 \text{ ms}^{-1}$  for  $N_\lambda = 21$ . In the case of the gain determination, the standard deviation ranges between 0.2 % and 0.1% for the scenarios with the poorest and highest spectral sampling, respectively.

### 4.3.3.2 Impact of the object approximation

To infer the error of the algorithm when the object is unknown, we compared the performance of the ideal case, that is, when the object used to generate the observations is known, with the one achieved when deconvolving the object from the data. Only the collimated setup was simulated in order to focus exclusively on the errors introduced by the deconvolution. The data has been degraded by Gaussian noise with an S/N = 200 in both scenarios.

Figure 4.16 shows the results for the two approaches. Interestingly, the error in the gain for the deconvolution approach does not decrease with a larger number of wavelengths, unlike the ideal case. Nevertheless, the average error of the calculation is below 0.4 %, with a dispersion ( $1\sigma$ ) of  $\pm 0.3\%$ . The deconvolution approach is prone to higher errors when deriving the gain due to the normalization of the profiles. The reason for this is two-fold. first, if the continuum is far enough from the spectral line, the normalization is strictly the integral over the transmission profile because the object is flat along the integration interval. However, this is not strictly true since the wings of the transmission profile can reach the spectral line (see Fig. 4.10), hence modifying the normalization of the profile when the object changes at each iteration. Second, should the continuum intensity of the derived object vary with respect to its real value due to the deconvolution process (e.g., due to boundary effects), there will be a shift in the intensity of the whole profile induced by the normalization process. These two effects seem to dominate the accuracy on the gain determination, regardless of the chosen sampling.

For  $\Delta a$ , the performance of the method is slightly worse than for the ideal case when using the deconvolution approach. Unlike the gain determination, errors in the  $\Delta a$  derivation show a strong dependence on the spectral sampling. Differences between both approaches

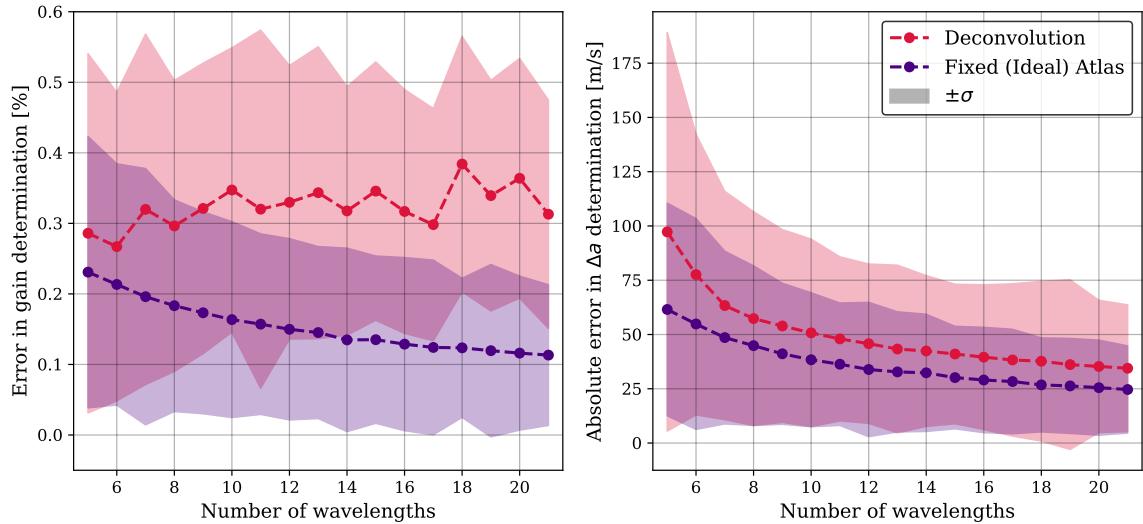


Figure 4.16 Errors in gain determination and etalon properties averaged over all the FoV with a signal-to-noise ratio of 200 and a collimated configuration.

range from  $10 \text{ ms}^{-1}$  to  $40 \text{ ms}^{-1}$  and increase with decreasing  $N_\lambda$ . The sensitivity with  $N_\lambda$  is especially high up to  $N_\lambda = 8$ . A modest increase of  $N_\lambda$  from five to six improves the determination of  $\Delta a \sim 20 \text{ ms}^{-1}$ , whereas at better spectral samplings, the difference between each simulation decreases more slowly, without any relevant improvement as the sampling increases. In any case, differences are all well within  $\pm 1\sigma$ .

#### 4.3.3.3 The crossover case

The fact that the sensitivity of the model to the gain and to the  $\Delta a$  parameters are different guarantees (to some extent) that the parameters can be separated from each other. The treatment of the problem is very different between etalon configurations, and therefore full knowledge of the setup is critical. However, this is not always feasible due to the unavoidable presence of errors, misalignment, and imperfections on the instrument. Approximations to describe the optical setup are also common in the pipeline of an FPI instrument because they reduce computational efforts. For instance, telecentric mounts are usually simplified as collimated setups, as the f-numbers employed in solar instruments are usually very large. Imperfections of telecentricity are commonly neglected, too. In this section, we analyze the impact of assuming an incorrect etalon mounting. To do so, we repeated the previous exercise, starting from a perfect and imperfect telecentric configuration but assuming that the transmission profile shape corresponds to a collimated one.

In this exercise, we assumed that we have an instrument with an FPI in a telecentric mount, as in the previous sections, in both perfect and imperfect configurations and an  $S/N = 200$ . We also considered that the object is given by the spectral solar atlas. The shift of the perfect telecentric transmission profile with respect to the collimated one was corrected using Eq.52 from Bailén et al. (2019a) to avoid the emergence of spurious velocity signals.

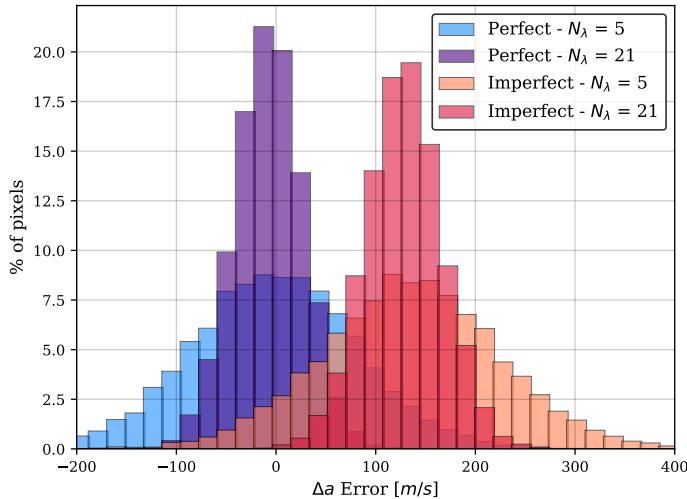


Figure 4.17 Distribution of the errors in the determination of  $\Delta a$  for the crossover scenarios (different configuration in the observation generation and minimization algorithm) for both perfect and imperfect configurations. Only results for the two extreme spectral samplings ( $N_\lambda = 5$  and  $N_\lambda = 21$ ) are shown.

Imperfections in the telecentrism shift the profile more. This additional displacement was left uncorrected intentionally so we could study its effects.

Figure 4.17 shows the error distributions for  $\Delta a$  when the model assumes a collimated configuration for  $N_\lambda = 5$  and  $N_\lambda = 21$  and for both perfect and imperfect configurations. The amplitude and dispersion of the error distributions are very similar for the two mounts and are comparable to the results obtained in the ideal case (Fig. 4.15, bottom panel). The main difference between the perfect and imperfect scenarios is a shift of  $130 \text{ ms}^{-1}$  for the reason mentioned above. We note that this shift can easily be accounted for since it is a known and measurable effect.

The similarity in the error distributions for the calculation of  $\Delta a$  in the two scenarios demonstrates that the error incurred when assuming a collimated etalon does not significantly impact the determination of the cavity maps of the etalon. This is because changes in  $\Delta a$  mostly induce a shift of the transmission peak by an equal amount in both cases.

We note, however, that the amplitude, width, and shape of the transmission profile differ significantly between the telecentric and collimated configurations, leading to an expected higher error in gain calculation. Figure 4.18 shows the absolute errors in gain and  $\Delta a$  calculations for both crossover scenarios and the ideal case after correcting the wavelength shift between the different mounts. For  $\Delta a$ , the performance of the method is very similar in the three setups, as also observed earlier. This behavior is nevertheless anticipated since the properties selected for simulating the imperfect etalon were chosen to mirror those of the SO-PHI etalon, which were adjusted to closely resemble the behavior of a collimated etalon to the greatest extent possible.

The differences are larger for the gain determination. Not only are the errors higher in the crossover cases, but the trend is entirely different. Instead of decreasing when increasing the number of wavelengths, gain errors remain the same for the perfect case and increase with the number of samples for the imperfect case. Similar to the deconvolution case (Fig. 4.16), the difference between transmission profiles introduces an error in the normalization process that systematically affects the rest of the measurements. This effect

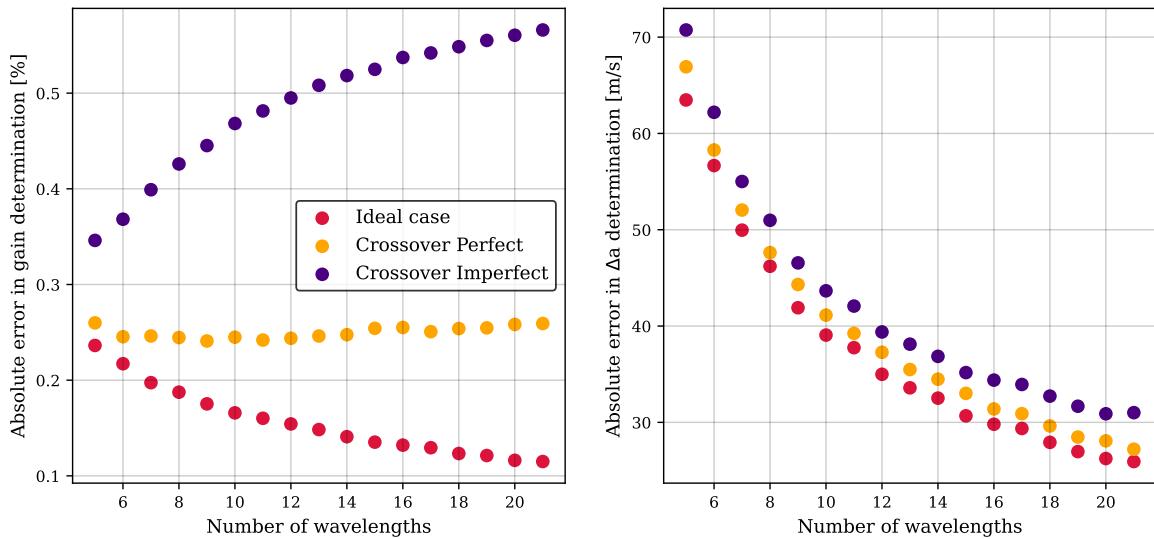


Figure 4.18 Average errors of the gain (left) and etalon defect (right) calculations over all the FoV for the two crossover cases and the standard case (also shown in Fig. 4.14 as the collimated case with S/N = 200) for reference. All  $\Delta a$  errors have been computed by correcting differential offsets of the transmission profile between the different mounts.

becomes more pronounced as the number of wavelengths increases, given that this error is introduced more frequently, and it is even more prominent in the imperfect case, as not only are the profiles different in this scenario, but they are also asymmetric. This asymmetry results in an imbalance in the measurement of the profile, as one wing of the spectral line has a higher transmissivity and is observed with greater intensity than the other.

Our results suggest that assuming an etalon in a collimated configuration for instruments with telecentric mounts can be a good first-order approximation for cavity map calculations, provided that the level of asymmetry of the transmission profile is known. However, achieving an accurate knowledge of the degree of telecentrism is often challenging in real instruments, as it usually varies across the FoV. Meanwhile, the results highlight that this approximation leads to a considerable increase in the error in the gain determination, which increases when increasing the spectral sampling. This contrasts with the standard philosophy of solar instrumentation, which requires a high number of points to better scan the spectral line.

#### 4.3.3.4 Real data

While simulated tests are crucial for understanding the algorithm's behavior as a function of the different parameters of the problem, tests with real data are required to validate the effectiveness of the method. In this section, we evaluate the results obtained by the algorithm when implemented on observations acquired using the High-Resolution Telescope (HRT) of the SO/PHI instrument.

The observation we used corresponds to a flat-field observation employing six points to

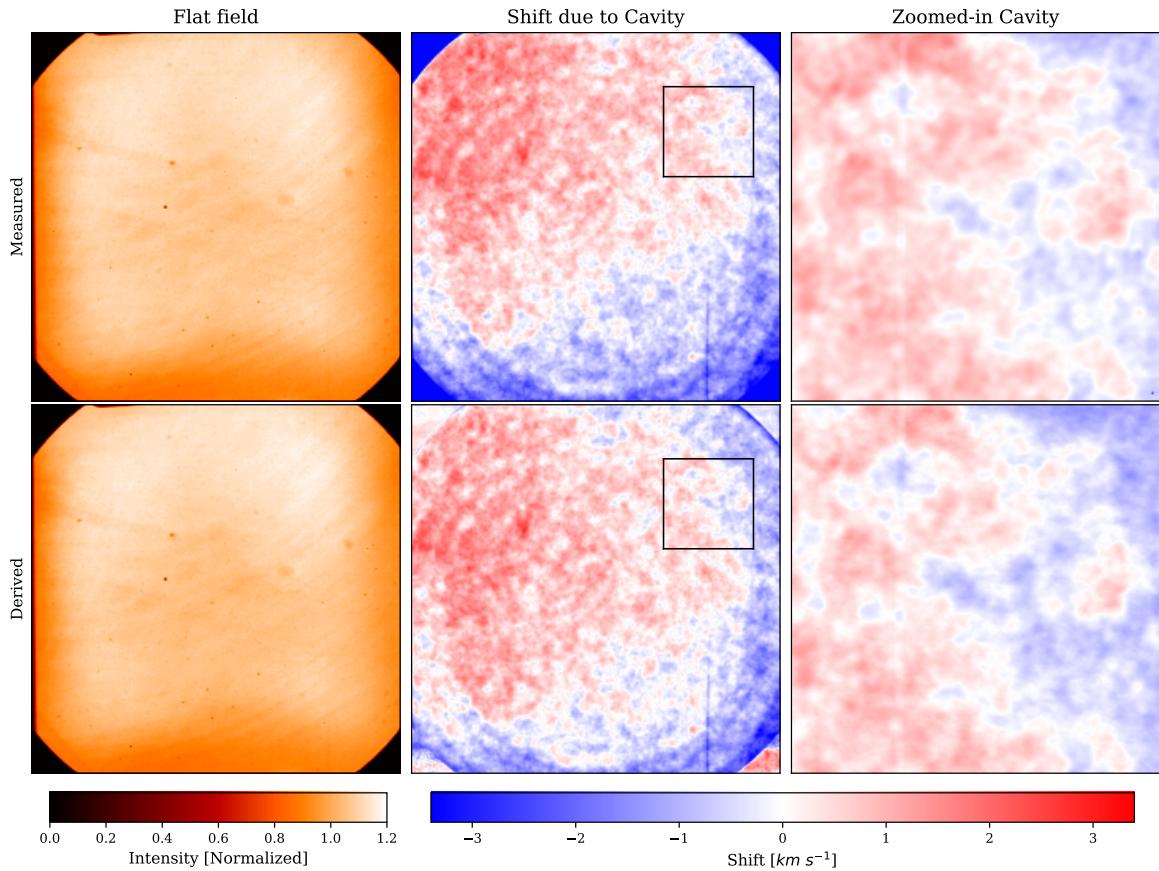


Figure 4.19 Comparison between the observed flat-field and cavity map (top row, left and center columns, respectively) and the derived flat-field (gain) and cavity map ( $\Delta a$ ; bottom row, left and center columns, respectively). The right column in both rows showcases a zoomed-in region of each cavity map. The area corresponding to the zoomed-in region is indicated with a black square in the full cavity map to its left. The properties used to simulate SO/PHI's etalon are  $R = 0.925$ ,  $n = 2.29$ ,  $d = 251.63 \mu m$ ,  $f\# = 60$ ,  $\Theta = 0.23^\circ$ .

scan the 6173 Å line (five along the spectral line and an additional continuum measurement) conducted on March 9, 2022. The FPI aboard SO/PHI is illuminated in a telecentric mount, with an expected degree of telecentrism of about  $0.3^\circ$ . The tests conducted with this dataset have the same procedure as the ones employed for simulated data, that is, we only fit the gain and  $\Delta a$  parameters, and we employed the deconvolution approach (Sect. 4.3.3.2).

Figure 4.19 shows the results obtained when applying the algorithm to HRT-SO/PHI data. The top row shows, from left to right, the observed flat at the continuum, the cavity map measured under laboratory conditions (on ground), and a selected region of the cavity map. In the bottom row, the same cases are shown but for the results inferred by the algorithm. That is, the flat-field (i.e., the gain) and the cavity map (i.e.,  $\Delta a$ ).

The results obtained for the cavity map closely resemble the laboratory measurements. The overall structure is preserved, maintaining the gradient from the upper left to the lower

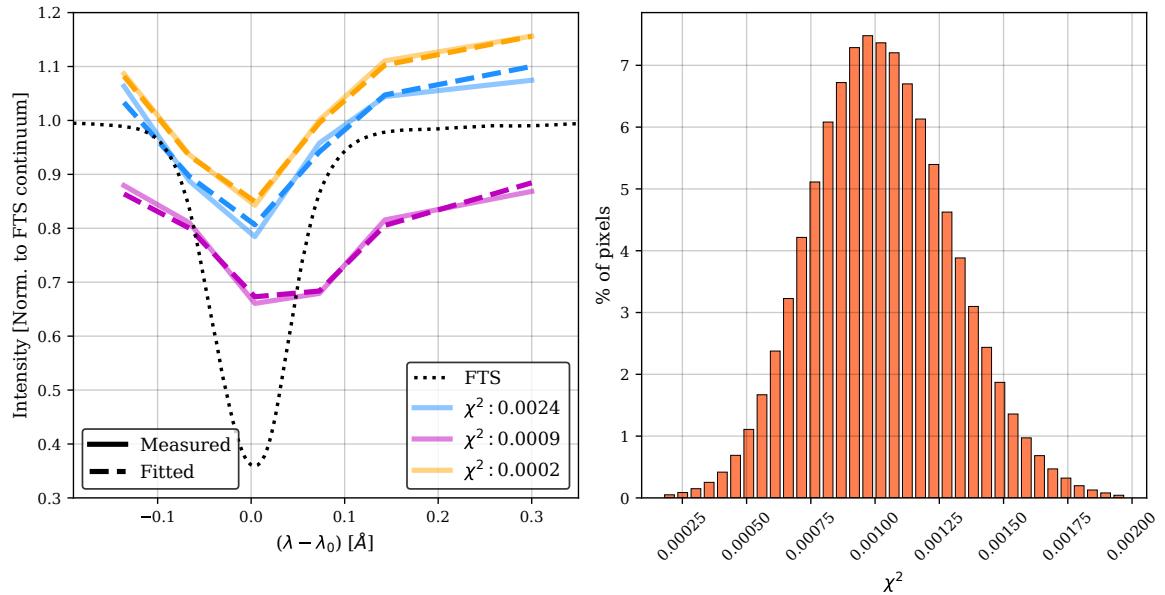


Figure 4.20 Comparison between the measured (solid lines) and fitted profiles (dashed lines) for three pixels, each representing varying degrees of accuracy (left panel). The FTS is shown as a reference. The right panel displays the distribution of  $\chi^2$  values for all pixels. Among the three selected cases, one demonstrates an average fit (depicted in pink, with  $\chi^2$  close to the mean value), while the other two correspond with extreme cases—one with a notably good fit and the other with a poor fit (depicted in yellow and blue, respectively). The value for  $\chi^2$  has been computed employing equation (4.15)

right. Similar structures are also discernible, such as the vertical line in the lower-right corner and the ring-like patterns evident in the lower section of the image. However, closer scrutiny of the observed structures revealed some differences. This deviation between results and measurements is expected, considering that the experiment conducted here represents a first-order approximation to assess the algorithm's capability to generate coherent results. Several factors contribute to these differences. Firstly, the spatial resolution of the cavity measured on ground is lower. Secondly, the degree of telecentricity has a predicted variation of  $0.23^\circ$  across the FoV. Thirdly, we expected an error for the six-point scan, employing the deconvolution strategy, as large as a hundred meters per second.

Concerning the results for the gain determination, the comparison depicted in Fig. 4.19 suggests that pixel-to-pixel gain variations can also be determined accurately with our method, as both small-scale and large-scale variations are reproduced with detail.

A more quantitative analysis of the results is depicted in Fig. 4.20. The left panel shows a comparison between the fitted and observed profiles for three distinct cases with varying degrees of precision, while the right panel shows the distribution of  $\chi^2$  for all pixels. In the worst-case scenario, small differences between the real profile and the fit can be seen in both the line wing and the line core. In any other case, the fittings are rather satisfactory.

## CHAPTER 5

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# SCIENTIFIC EXPLOITATION.

In earlier chapters, we explored data collection and reduction, along with the instrumental challenges involved. Once data has been appropriately reduced, the next step is scientific exploitation, as this is the ultimate goal of all instrumentation.

This chapter presents an example of exploiting spectropolarimetric data through the study of magnetic field intensity maps, or magnetograms, recorded with both Hinode/SOT and SDO/HMI. Aligned with the computational focus of this thesis, we apply a novel data processing approach for studying solar magnetograms: a topological data analysis technique known as persistent homology. The research in this chapter stems from work completed during a two-month stay at NAOJ between the first and second Sunrise III flights, leading to the publication of the article "Persistent Homology Analysis for Solar Magnetograms".

We begin by discussing the motivation for introducing new techniques in solar magnetogram analysis and the specific benefits of persistent homology. A general overview of the method follows, introducing the tools it provides. Finally, we present our analysis, illustrating how persistent homology helps characterize magnetic structures and dynamics in both quiet Sun regions and active regions.

### 5.1 Persistent Homology in Solar Magnetograms.

The ability to encode and simplify all information about the shape and distribution of data has made Topological Data Analysis (TDA) one of the most relevant fields in state-of-the-art data analysis. In recent years, we have witnessed a rise of studies based on TDA techniques in many fields of science, such as biomedicine (Bendich et al., 2016), atomic physics (Ormond Morley et al., 2021), image recognition (Clough et al., 2020) or cosmology (Green et al., 2019), among many others.

Among the numerous techniques of TDA, persistent homology is arguably the most widely used approach for studying real data. By examining the persistence of topological features, persistent homology can identify significant structures present at different scales, and at the same time, its performance is very robust against noisy and/or incomplete data (Otter et al., 2017). Furthermore, persistent homology provides a straightforward and intu-

itive way for the visualization of the results. This simplifies the interpretation of the results, while also serving as a good descriptor of the data's topological properties, therefore making it a suitable input for machine learning algorithms.

The application of these techniques in solar observations presents a promising approach to understanding the complex structures and dynamics of the Sun's behavior. Specifically, the analysis of the solar magnetic field using magnetograms is particularly well-suited for the application of these methodologies, given the intricate and multi-scale nature of the magnetic structures. Solar magnetograms provide a visual and quantitative representation of the magnetic field in the photosphere and are one of the fundamental tools for the study of our star. The magnetic activity of the Sun is very diverse, from the quieter events occurring in the quiet Sun to the more violent and extreme events like solar flares and coronal mass ejections (CMEs) in active regions. In this sense, magnetograms are very useful as they enable us to study all these events through magnetic field measurements.

Numerous studies utilize magnetograms to investigate the behavior of solar magnetic fields. The intricate nature of the magnetic structures has led to the development of various techniques, each tailored to focus on distinct properties of the magnetic field. One of these techniques is the study of the power spectrum of magnetograms through Fourier transforms, as employed in numerous works: in Abramenko (2005), where they attempt to establish a correlation between the magnetogram power spectrum and flare production; in Abramenko & Yurchyshyn (2020), where they use the magnetogram power spectrum to study the quiet-sun turbulence; in Katsukawa & Orozco Suárez (2012), where they analyzed the power spectrum of different physical quantities and study their dependence with the total magnetic flux; or in Danilovic et al. (2016), where they tried to reproduce the magnetograms power spectrum through simulations, among other instances.

Different approaches are also common. Some examples of alternative methodologies can be found in: Abramenko & Yurchyshyn (2010), where they study the intermittency and multifractality of the magnetic structures and their relation with flaring activity; in Georgoulis & Rust (2007), where they study the magnetic connectivity to define a criteria for the distinction of flaring and nonflaring regions; or in Gošić et al. (2014), where they analyze long time series of magnetograms with high cadence and spatial resolution to calculate the number of field appearances and cancellations, as well as their interactions, to determine the net magnetic fluxes on the Sun's surface; among many other approaches in the field.

The increasing volume of data generated by modern instruments highlights the growing importance of data analysis techniques. Many studies have directed their efforts towards the development of automatic feature detection and tracking algorithms for solar magnetograms. Prominent examples of widely employed approaches for Quiet Sun studies include SWAMIS\* (DeForest et al., 2007), as employed, for example, in Lamb et al. (2013), where they employ the code to track the magnetic elements and study the flux dispersal in the Quiet Sun. Another example is YAFTA<sup>†</sup> (Welsch & Longcope, 2003), employed in Orozco Suárez et al. (2012), where they track the proper motion of magnetic elements of the Quiet Sun to study the dynamics of supergranular flows. Concerning active regions, there have been nu-

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\*The Southwest Automatic Magnetic Identification Suite

<sup>†</sup>Yet Another Feature Tracking Algorithm

merous works on the matter of classification and detection methods, from the well-known, and classical approach of the Mount-Wilson classification (Hale et al., 1919), to more recent contributions, such as the SHARP<sup>‡</sup> tool (Bobra et al., 2014), that has emerged as one of the most prominent algorithms for this purpose.

Although these studies provide valuable insight into the processes occurring in the photosphere and the interrelations of the solar magnetic field with other solar phenomena, the underlying governing laws remain highly complex and challenging to fully ascertain. The integration of TDA techniques into these analyses has the potential to offer a previously unexplored perspective on these phenomena that complements the current knowledge. Persistent homology algorithms share similar methodologies (such as image thresholding) with other feature detection/tracking codes like SWAMIS or YAFTA. However, unlike these codes, persistent homology provides topological information about the detected features and employs it to discern between different types of structures. This includes information on the connectivity to neighboring features, the shape of the feature, and the presence or absence of holes in the magnetic feature. All this information allows persistent homology to distinguish between different types of magnetic features based on their topological properties, and to identify and track the presence of a particular type of magnetic structure. In addition, since these algorithms can identify the pixels that make up each topological feature, they can be used to outline magnetic elements and facilitate conventional calculations such as determining the size or flux of magnetic structures.

In particular, topological techniques can be particularly useful for studies related to solar flares. It is well known that active regions exhibiting intricate structures are linked to the occurrence of solar flares. Three critical factors establish a connection between the characteristics of active regions and flare production: surface area, magnetic complexity, and rapid temporal evolution (Toriumi & Wang, 2019). While the first factor is straightforward to measure (e.g., the sunspot area and total unsigned magnetic flux), persistent homology techniques may enable topological quantification of the latter two, which present greater challenges when utilizing conventional methods. Some studies have already delved into this concept; for example, in Deshmukh et al. (2023), they employ a persistent homology analysis to explore the predictive capabilities of a machine learning model for the forecasting of solar flares based on the topological information extracted from solar magnetograms. However, they did not study the correspondence between the magnetic features and the topological information extracted from persistent homology, which is the main focus of this work.

### 5.1.1 Persistent Homology

Persistent homology stands out as a prominent technique within the topological data analysis toolkit, primarily for its capacity to capture the shape and distribution information of a dataset. The algorithm is rooted in the mathematical framework of homology groups. In topology, these groups measure the number of  $n$ -dimensional holes in a data set, or in other

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<sup>‡</sup>Spaceweather HMI Active Region Patch

words, the number of connected components for a  $0^{th}$  dimensional analysis, holes or rings for a  $1^{st}$  dimensional analysis, spherical voids for the  $2^{nd}$  dimensional analysis, and so on.

The primary objective of persistent homology is not only to compute the homology groups of a given dataset but also to study how they vary at different scales. To achieve this, the input data undergoes a process of division into a series of sequential subspaces, with each subspace encompassing the previous one. This sequential process, known as filtration, begins with a starting subspace comprising a single point from the original dataset. Subsequent subspaces are then constructed by incrementally adding points to the previous subspace until the final subspace includes all points of the original dataset.

After the filtration process is performed, persistent homology algorithms shift their focus to analyzing the evolution of topological features across the different subspaces. Specifically, they record the filtration value at which a new feature appears, meaning that it is absent in the previous subspace, and when it disappears, meaning that it is no longer present in the following subspaces. These two events are known as the birth and death of a topological feature, respectively.

In a nutshell, the  $n$ -dimensional persistent homology of a dataset with a given filtration can be described as the aggregation of all  $n$ -dimensional features (homology groups) that were created (birth) and subsequently eliminated (death) during the filtration process (Hensel et al., 2021).

When applying persistent homology on a greyscale image, our focus lies in filtering the data according to the pixel values. Multiple filtering approaches exist, with the most extended ones being sublevel and superlevel filtrations, both based on the concept of thresholding. In these filtrations, the image is cropped to a specific value, forming a subspace that includes all pixels with values higher than this value in a superlevel filtration, or lower in a sublevel filtration. This cropping value (i.e. the filtration value) is systematically varied from the lowest to the highest values of the image, or vice versa, thus generating a different subspace for each value. As a result, the persistence homology analysis captures and examines the evolution of topological features across different thresholds, enabling insights into the image's structural properties at various scales (Barnes et al., 2021).

A more formal way of defining these filtrations can be done by considering an image as a discrete representation of a function  $f$ , defined over a two-dimensional space  $\mathbb{X}$ , such that:

$$f : \mathbb{X} \longrightarrow \mathbb{R} . \quad (5.1)$$

Let  $\mathbb{S}_\phi$  be the subspace of  $\mathbb{X}$  for a filtration value of  $\phi$ . In such a case, a filtration can be expressed as:

$$\mathbb{X} : \mathbb{S}_{\phi_0} \subset \mathbb{S}_{\phi_1} \subset \mathbb{S}_{\phi_2} \subset \dots \subset \mathbb{X} . \quad (5.2)$$

With this formulation, a topological feature with birth-death coordinates:

$$(B, D) = (\phi_I, \phi_{II}) , \quad (5.3)$$

corresponds to a feature that appears for the first time during the filtration process at the subspace  $\mathbb{S}_{\phi_I}$ , and *persists* until the subspace  $\mathbb{S}_{\phi_{II}}$ , where it ceases to exist.

In a sublevel filtration, each subspace can be expressed as:

$$\mathbb{S}_\phi = f^{-1} ((-\infty, \phi]) , \quad (5.4)$$

where  $\phi_0$  is selected as the lowest value for any given pixel and its value is increased until the subspace includes all pixels. On the contrary, in a superlevel filtration, the subspaces can be expressed as:

$$\mathbb{S}_\phi = f^{-1} ([\phi, \infty)) , \quad (5.5)$$

where  $\phi_0$  is selected as the highest value for any given pixel and its value is decreased along the filtration.

Various methods exist for representing the information derived from a persistent homology analysis, including Betti numbers, persistence bars, and persistent diagrams (PDs) (Cohen-Steiner et al. 2005, Aktas et al. 2019), among many others. For this study, we will utilize the PDs as our chosen approach due to their straightforward interpretation and extended use. A  $n$ -dimensional PD is a multiset of Birth-Death pairs,  $(B_i, D_j)$ , with multiplicity  $k$ , where each pair measures the number ( $k$ ) of  $n$ -dimensional components that have been born at the filtration subspace  $\mathbb{X}_i$  and died in  $\mathbb{X}_j$ , that is usually represented in a 2D scatter plot.

The process of generating a PD of a greyscale image is as follows. We start by selecting the filtration direction (sublevel or superlevel) and the dimension of the analysis (either 0 or 1). We initialize a threshold as the highest or lowest value from the image, depending on the choice of filtration. We then perform the filtration by systematically adjusting the threshold and creating a binary image for each threshold. This process divides the image into two sets: pixels with values matching or above the threshold and pixels with values below it. The choice of filtering determines which of the two sets makes up the subspace. We then look for the existing topological features within each of these subdivisions. The specific process by which these features are identified is detailed in the next paragraph, where the structures corresponding to both dimensions are illustrated using the example shown in Fig. 5.1. We repeat this process until the threshold reaches the opposite limit to that from which it started. Along this process, we follow the appearance, merging, and disappearance of connected components. When two components merge, the longer-lived one (*i.e.* the first to appear along the filtration process) absorbs the younger one, thus resulting in the death of the second (Edelsbrunner & Harer, 2022). We determine the birth and death for each component based on the thresholds at which these events occur. Finally, we construct a scatter plot where the horizontal axis represents the birth values and the vertical axis represents the death values. Each point on this plot corresponds to a persistence point, whose coordinates reveal the scales at which the corresponding topological feature is present.

An example of this process with a sublevel filtration is shown in Fig. 5.1. Panel a) displays the input data, panels b), c), d), f), g), and h) show some of the key steps of the filtration process, and, lastly, panel e) displays the PD for a  $0^{th}$  and  $1^{st}$  dimensional analyses. These plots illustrate how connected components and rings are born and then die as we increase the filtration level. As these components (shown in different colors) increase in size and come into contact with other components, one absorbs the other, thus resulting in the death

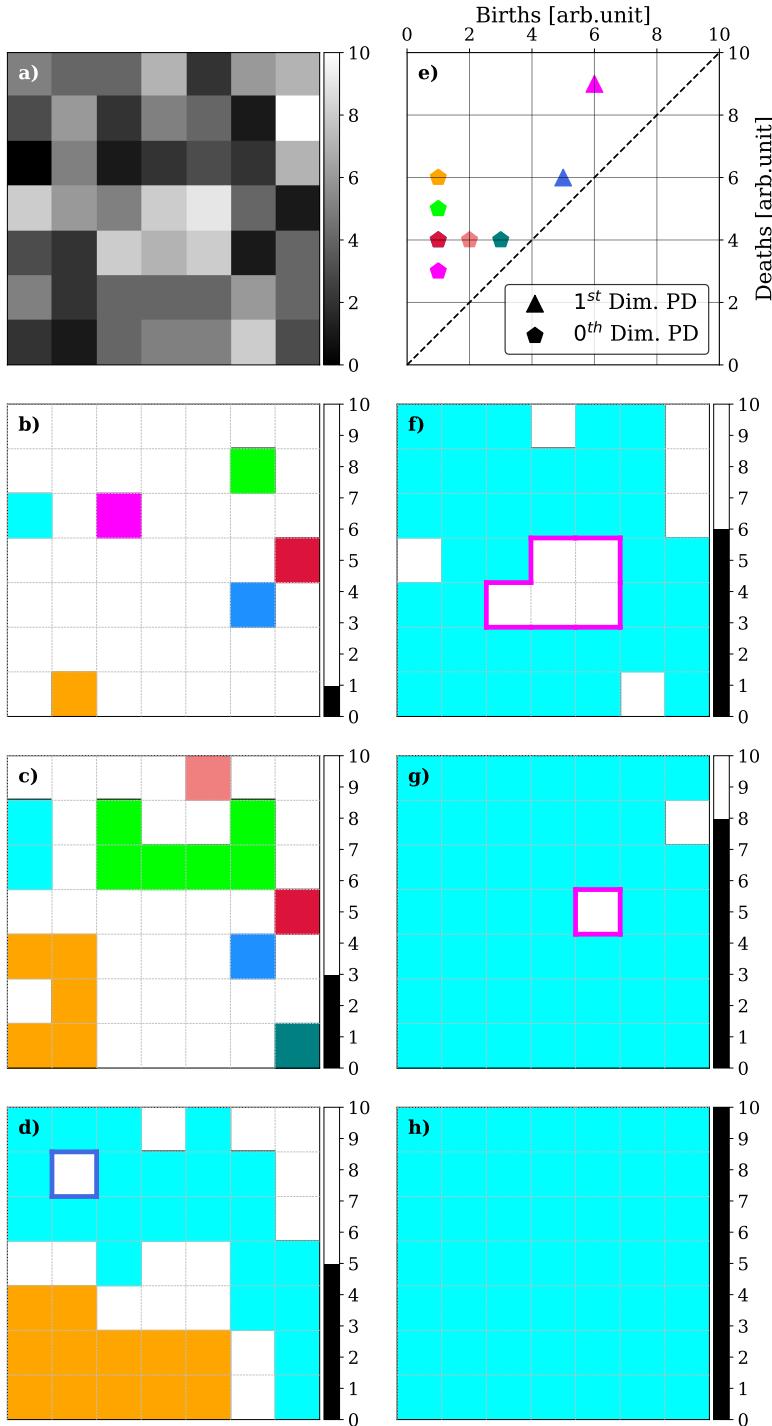


Figure 5.1 Sublevel filtration of a greyscale image and PDs of the 0<sup>th</sup> and 1<sup>st</sup> dimensions. Panel a) shows the input data. In panels b), c), d), f), g), and h) different snapshots of the filtration process are shown. The value of the filtration parameter,  $\phi$  is shown in the color bar at the right of each image. Only pixels with a value lower than the filtration value (colored pixels) belong to the subspace shown in each snapshot. Different homology groups are represented with different colors at each snapshot. For connected components (0<sup>th</sup> dimensional homology groups) the whole pixel is shown with the corresponding color. For rings, (1<sup>st</sup> dimensional homology groups), only the border of each hole is colored. In panel e) the PDs of both dimensions are shown. The color of each point in the diagram is the same as the one used to plot the corresponding topological feature in other panels.

of the second. This phenomenon is shown in panels b) to d), where we observe the progression of the components until only the blue and orange connected components remain. Additionally, the diagrams also reveal the appearance of two rings in the data (panels f) and g)). These rings are found when pixels that do not belong to the subspace are surrounded by a connected component, and die when those pixels are included in the component as the threshold increases (blue ring in panel d)). Finally, the PD (panel e)) displays the birth and death values (i.e. the filtration value) of all the features, of dimensions 0 and 1, that have been identified (birth) and subsequently eliminated (death) throughout the filtration process.

### 5.1.2 Persistent Images

The PD displayed in Fig. 5.1 contains only a limited number of points due to the simplicity of the input image. However, when analyzing real data, these diagrams can consist of hundreds or even thousands of birth-death pairs with high multiplicities, simply due to the size of the images. Additionally, features not only representing the genuine behavior of the data but also reflecting the distribution of noise appear on the diagrams. To address this complexity, several strategies have been developed to simplify the information from PDs, such as persistence curves (Chung & Lawson, 2019), persistence landscapes (Bubenik et al., 2015), or persistence images (PI) (Adams et al., 2017). In this study, we will focus on the latter, due to its noise filtering capabilities and because the representation of the results remains in a Birth-Death diagram, allowing for easy interpretation of the results, similar to a persistence diagram.

PIs are a condensed form of a persistence diagram, offering a concise and easy-to-understand representation of its topological features. They capture the spatial distribution and persistence information of these features, allowing for the enhancement of the most relevant ones and filtering of the others. A PI is constructed using the concept of persistence. Each topological feature, represented by a point in a PD, has a persistence,  $\pi$ , of:

$$\pi = D - B \quad (5.6)$$

where  $(B, D)$  are the corresponding birth-death coordinates in the diagram. A feature with a large persistence is present at different scales in the data and therefore is more likely to represent the real behavior of the data. On the contrary, short-lived features are typically associated with the noise distribution and usually do not provide much information about the data.

When constructing a PI, a weighting function,  $\omega(\pi)$ , is employed to assign weights to each point in the diagram, ensuring that longer-lived features have greater weights than shorter-lived ones. There are multiple choices for the shape of the weighting function, which are entirely dependent on the aims of the study and data type. The simplest example is often a linear or power-law relation ( $\omega(\pi) = a\pi^b$ ), where  $a$  and  $b$  can be tuned to assign progressively higher weights to higher persistencies, thus focusing the study on the longer-lived components. On the other hand, if the objective is to filter out noise while assigning

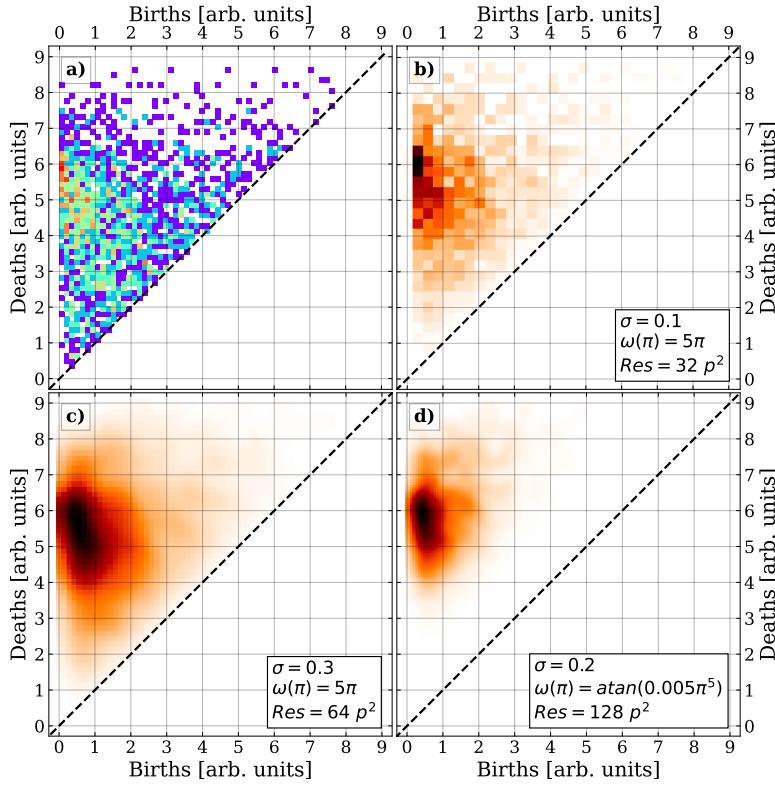


Figure 5.2 Panel a) shows an example of a persistence diagram as a 2D histogram. The color of each bin represents its multiplicity, with the red spots corresponding to higher values. Panels b), c), and d) show three different examples of PIs. The three parameters given in the legends of the PIs are: the standard deviation ( $\sigma$ ) of the Gaussian kernel ( $K(z)$ ), the weighting function, and the resolution of the image PI in pixels ( $p$ ).

similar weights to all non-noise points so that all points have a similar relevance in the analysis, the chosen function is usually an arc-tangent.

The PI is then generated by dividing the persistence diagram plane into a grid with a desired resolution. Within each grid region (or pixel), the weighted features of the diagram within the region are added up using a kernel density estimation. The kernel function,  $K(z)$ , can be tuned to suit the nature and objectives of the analysis, with Gaussian functions being the most common approach.

The resultant PI is a 2D matrix, wherein each pixel corresponds to a specific area in the persistence diagram, and its value represents the cumulative weight of the topological features found within that area. In Figure 5.2, three examples of PI (panels b), c), and d)) are presented for the same persistence diagram (panel a)), where distinct choices of resolution, kernel function, and weighting function have been applied to each image.

All the PDs, PIs, and the rest of the analysis tools presented in this work, have been computed using the Homcloud python package (Obayashi et al., 2022).

### 5.1.3 Data

In this work, we study the results of applying persistent homology to different regimes of solar activity by applying the analysis to both quiet Sun and active region magnetograms.

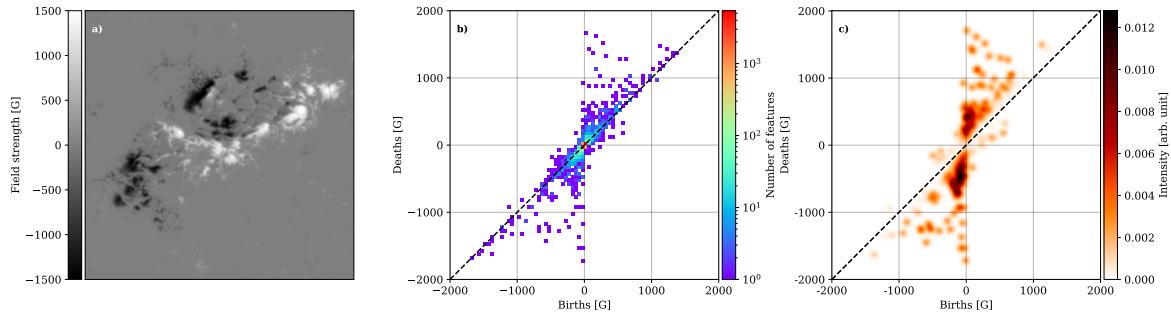


Figure 5.3 (a) SDO/HMI magnetogram taken on 2011-02-13 depicting an active region (NOAA AR 11158). (b) The corresponding PD combining superlevel and sublevel filtrations. (c) PI generated from the PD in panel b) with the following configuration: Resolution = 1000 pixels<sup>2</sup> (4 G per pixel), weighting function:  $\omega(\pi) = \arctan(5 \times 10^{-8} \pi^3)$  and a gaussian kernel with  $\sigma = 40$  G.

### 5.1.3.1 Quiet Sun observations

The study of quiet Sun regions requires high magnetic spatial and temporal resolutions and sensitivities to be able to capture the small-scale evolution of the magnetic structures due to their weak signals and short time scales (Bellot Rubio & Orozco Suárez, 2019). For this reason, we employ observations taken by the Solar Optical Telescope (SOT; Tsuneta et al. 2008) aboard the *Hinode* satellite (Kosugi et al., 2007), a space-borne solar observatory. In particular, we employ observations from Hinode's Operation Plan (HOP) 151. These observations consist of long ( $\geq 20$  h) and mostly uninterrupted sequences of measurements of the Narrowband Filter Imager of the Na I D1 line at 5896 Å taken with a cadence of 50–70 s. The data correction of the selected observation sets has been carried out in (Gošić et al., 2014).

### 5.1.3.2 Active regions observations

We employ observations of active regions (ARs) taken by the Helioseismic and Magnetic Imager (HMI; Scherrer et al. 2012, Schou et al. 2012) on board the Solar Dynamics Observatory (Pesnell et al., 2012). HMI provides a continuous observation of the Sun where a full-disk magnetogram, as well as Dopplergrams, are provided at all times. The full-disk, uninterrupted observations of HMI make it a very suitable instrument to study the evolution of active regions as the formation and development of active regions can be fully captured.

We focus the analysis on a series of newly-emerging ARs identified in (Toriumi et al., 2014a). In particular, we employed the 12-minute cadence observations taken during the period from May 2010 to June 2011, which corresponded to a period of low solar activity.

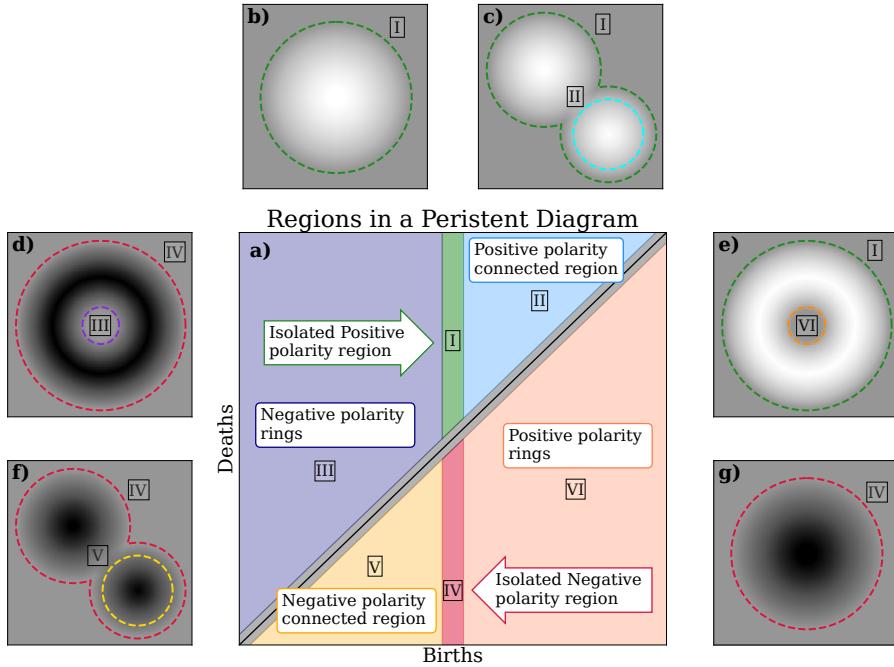


Figure 5.4 Schematic representation of the PD and the different regions (panel a)). The magnetic structures corresponding to the topological features found in the different regions are shown in panels b) to g), with each feature identified by a ring with the corresponding color.

#### 5.1.4 Analysis and results

The application of persistent homology to a specific dataset can vary depending on the aims of the study. Different dimensions of the analysis and various types of filtrations focus on distinct features within the data. It is crucial to have prior knowledge of the expected structures and relevant features to be captured in the analysis in order to determine the appropriate approach. In this section, we aim to outline the most appropriate approach for studying the particular case of solar magnetograms.

The solar magnetograms employed here represent the longitudinal component of the magnetic field on the photosphere and are typically presented as greyscale images, as shown in Figure 5.3, panel a). The polarity of the line-of-sight magnetic field is indicated by the sign of each pixel, where positive and negative signals correspond to field lines pointing towards and away from the observer. Applying a single filtration to a greyscale image only displays features corresponding to one polarity (positive or negative) in a PD. However, to conduct a comprehensive study of the magnetic field, both polarities are essential, thus necessitating the use of two separate filtrations with different filtration directions.

We determined that a combination of superlevel and sublevel filtrations with a 1<sup>st</sup>-dimensional persistent homology analysis was the most suitable approach for studying solar magnetograms. This choice is based on two main reasons. Firstly, the 1<sup>st</sup> dimensional analysis allows us to identify the most prominent features in a PD, which is not the case in

the  $0^{th}$  dimensional analysis where the strongest feature does not appear in the diagram as it never dies (see Fig. 5.1). Secondly, by combining superlevel and sublevel filtrations, we can display the results of both filtrations in a single diagram. Features corresponding to different filtrations will have persistencies with opposite signs (features found in a superlevel filtration will be born at higher filtration values than their death, resulting in a negative lifespan). This enables us to construct a PD in which all features displayed above the identity line (with positive persistencies) correspond to the sublevel filtration, and those below the line correspond to the superlevel filtration (see panel b) in Fig. 5.3).

The PDs, and consequently the PIs, offer valuable insights into the magnetic structures present in the magnetograms. The location of a topological feature on the diagram is completely determined by the properties of the corresponding magnetic structure. Specifically, this position is influenced by factors such as the maximum intensity of the magnetic field, its proximity to other magnetic structures, and its geometric shape, including the presence of holes or pores within the structure. These characteristics allow us to partition the diagram into distinct regions, where topological features within each region correspond to different types of magnetic structures.

We distinguished between six distinct regions in the diagram. Figure 5.4 illustrates these regions in panel a) and provides schematic representations of the corresponding magnetic structures in panels b) to g). The regions are as follows: first, topological features located above the identity line (positive persistencies) with birth values close to 0 (region I in the diagram). Features within this region represent isolated magnetic structures of positive polarity, that is, patches of positive magnetic flux fully enclosed by an absence of any magnetic field. The threshold defining what is considered “close to 0” is determined by the data’s properties. To identify isolated structures, we set the threshold as a function of the statistical properties of the background signal (i.e. areas of the magnetogram with little magnetic flux). Specifically, the limits for this region are set as  $(-5\sigma_{bg}, 5\sigma_{bg})$ , where  $\sigma_{bg}$  denotes the standard deviation of the background signal found in a  $15 \times 15$  pixels box devoid of strong magnetic structures.

The second region (II in the diagram) comprises features above the identity line with positive birth values, representing connected structures with positive polarities, that is, positive magnetic field structures in contact with another positive structure but not fully merged. The third region (region III) contains topological features above the identity line with negative birth values, which corresponds to magnetic structures of negative polarity exhibiting a ring-like attribute, namely, structures with pores or holes. These three regions of the diagram have counterparts with negative persistencies. Thus, features associated with isolated structures of negative polarities are found in the region with a birth value close to 0 but below the identity line (region IV), features for connected negative structures are also located below the line but with negative birth values (region V). Lastly, features arising from positive magnetic structures with ring-like attributes are found below the identity line but with positive birth values (region VI).

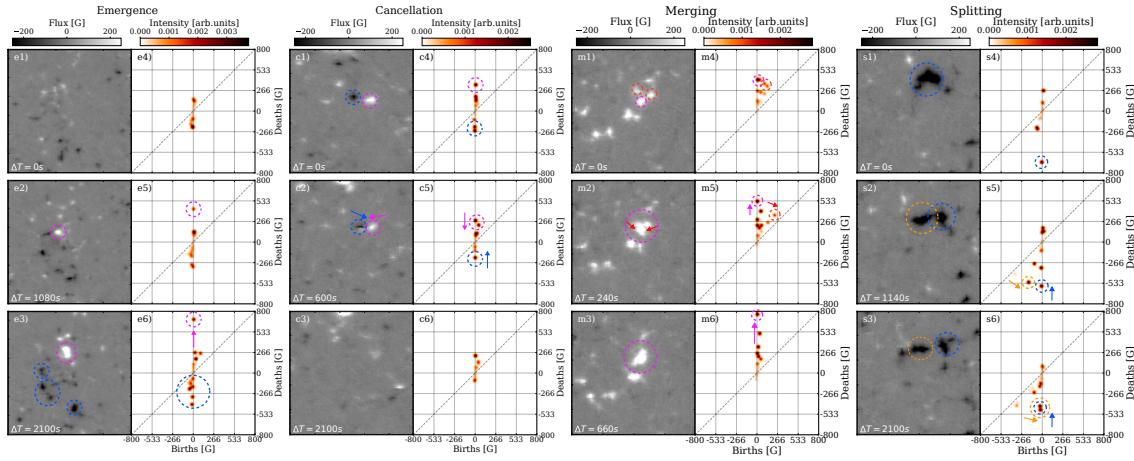


Figure 5.5 Examples of flux emergence (left column), flux cancellation (central left column), merging (central right column), and splitting (right column) events in the quiet sun. The time interval shown in the magnetograms is always with respect to the first frame (panel a) for emergence and g) for cancellation). The PIs correspond to the magnetogram to their left. The parameters for their computation are: resolution = 1000 pixels<sup>2</sup> (1.6 G per pixel), weighting function:  $\omega(\pi) = \arctan(5 \times 10^{-7} \pi^3)$  and a Gaussian kernel with  $\sigma = 16$  G.

#### 5.1.4.1 Quiet Sun results

Quiet Sun regions are characterized by the presence of weak, small-scale magnetic field signals that exhibit rapid evolution. This rapid evolution leads to a multitude of signals in a single snapshot that evolve quickly from one frame to another. The small scale and rapid changes of the processes of the quiet Sun make data analysis techniques desirable for their study due to the complexity of such endeavors.

When examining the evolution of signals across the entire field of view, we observe a dynamic process characterized by numerous regions interacting destructively while new signals emerge throughout the whole region. Despite these continuous changes, the overall structure of the magnetogram appears stable, with consecutive snapshots exhibiting strikingly similar properties. This apparent equilibrium state is also evident when studying the PIs, as consecutive frames show minimal differences in their representations.

Due to the apparent equilibrium state of the overall structure of the magnetograms, it is necessary to narrow down the field to which we apply the analysis. We found that when the number of signals in the studied region is lower, we can observe flux cancellation and emergence events, as well as merging and splitting events, through the changes induced in the persistence diagram. In cancellation events, two regions of magnetic flux with opposite polarities interact destructively, nullifying each other. On the contrary, in flux emergence events, we observe signals of both polarities suddenly emerge from a region with little magnetic flux. In splitting and merging events, only one polarity is involved. Two or more distinct structures of equal polarity merge together in merging events, and a single structure is divided into two or more for splitting events.

In Figure 5.5, an example of an emergence event is shown in three snapshots through

the magnetograms (panels e1 to e3) and their corresponding PIs (panels e4 to e6). When we focus on the second snapshot (panel e2 and e5), we see that a new positive and isolated feature (birth  $\sim 0$ ) that was not present in the previous snapshot has appeared in the PI and stands out from the rest of the signals (highlighted with a pink circle in both magnetogram and PI), while simultaneously, the density of negative polarity features also begins to increase. In the last frame, we see that in the case of positive polarity, the majority of the signal has concentrated in a single structure, as shown by the increase of the death value of the corresponding feature in the PI. A few connected features are also seen, but these are less significant. Meanwhile, the negative polarity signal has been distributed into multiple structures instead of concentrating in a single one, as evidenced by the absence of a prominent feature in the PI and the increased density of connected features (highlighted with blue circles both in the PI and the magnetogram).

A very similar analysis can be carried out to analyze cancellation events. The evolution of the persistence image is very similar to that of the emergence events but in the opposite direction. Figure 5.5 also shows an example of a flux cancellation event through magnetograms (panels c1 to c3) and PIs (panels c4 to c6). In the beginning, the PI shows the presence of features of opposite polarities. When the corresponding structures approach each other and begin to interact, the magnetic signal starts to decrease, which is observed in the PI as a simultaneous movement of the features towards the center of the diagram. This reduction in signal continues until both features reach the center of the diagram, which corresponds to the moment when they will have completely canceled each other out (panels c3 and c6).

For the events that only involve one polarity, namely merging and splitting events, the same behavior is seen in the PI for positive and negative features, but on their respective sides of the PI.

An example of a merging event of positive polarity structures is shown in Fig. 5.5, in panels m1) to m6). These events start with multiple isolated, or interacting structures (as shown in panels m1 and m4), that are moving towards each other. As the structures cluster, two movements are seen in the PI: firstly, the features corresponding to the structures with the weakest field (red features in panels m2 and m5) move towards the identity line; and secondly, the feature corresponding to the main structure (pink feature in panels m2 and m5) experiences an increase in its absolute death value due to the increase in magnetic flux coming from the rest of the structures. When the structures are fully merged, only a single feature appears in both the magnetogram and PI (pink feature in panels m3 and m6), in the isolated region (region I or IV, depending on the polarity).

This process is reversed for splitting events, as shown in panels s1) to s6) of Fig. 5.5. We see how an initially isolated feature in the PI (blue feature in panels s1 and s4) evolves into two (or multiple) features. When the process has started, but the two parts have not yet completely separated, a second feature appears in the diagram in the region corresponding to the connected structures (regions III or V in the diagram), as shown in panels s2) and s5). As the two structures continue to separate, this second feature gradually approaches the region for isolated structures (regions I and IV) as the magnetic field surrounding it in the magnetogram diminishes (panel s5). Eventually, when both structures are completely

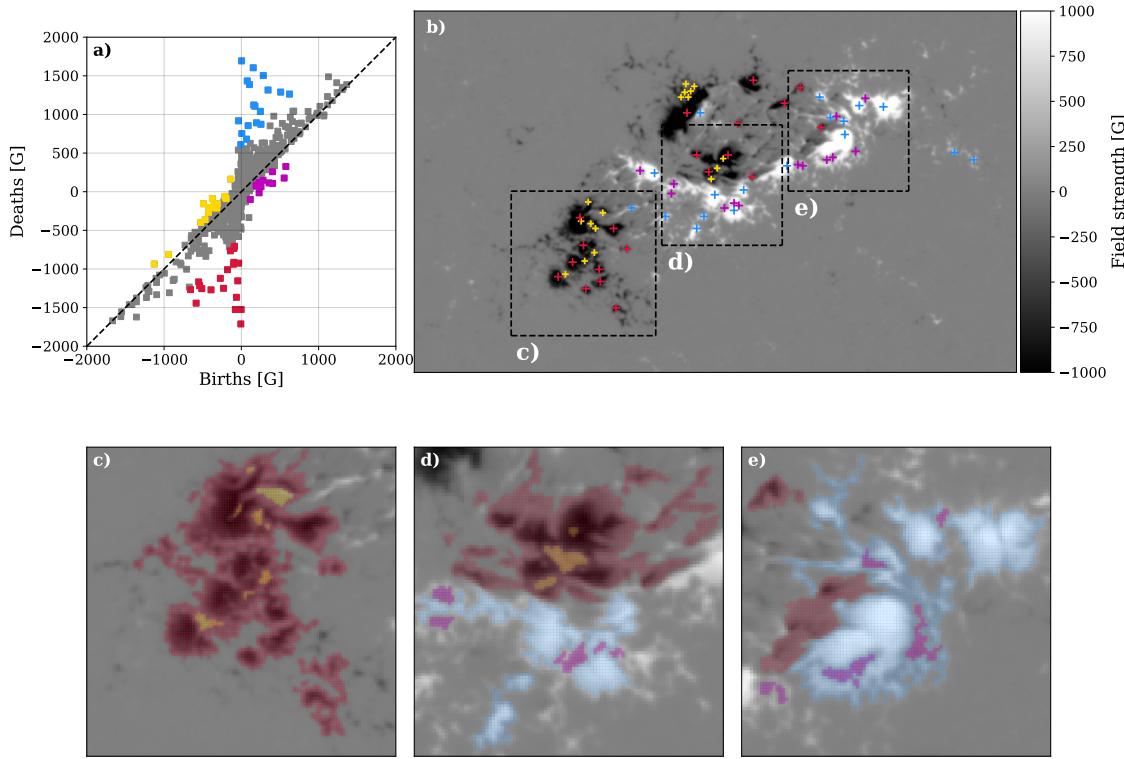


Figure 5.6 SDO/HMI magnetogram taken on 2011-02-13 at 06:34 UT depicting an active region (NOAA AR 11158) and the corresponding persistent diagram (panel a)). Panels c) to e) display a zoomed region of the active region, corresponding to the labeled region with the same letter in panel b). Features of different types are shown in different colors in the diagram. The corresponding structures are shown in the same colors in the magnetograms; as colored crosses in panel b) and as a colored transparent overlay displayed over the whole pixel in panels c) to e) to show the extent of the structure.

separated (i.e. with no signal around them), they will both appear on the diagram as two isolated features with a lower death value compared to the initial one (panels s3 and s5). This reduction occurs because the magnetic flux is distributed between the two structures.

#### 5.1.4.2 Active region results

It is important to understand which types of magnetic structures can be identified through persistent homology and establish the correspondence between these structures and the position of the corresponding topological feature in a persistence diagram. To achieve this understanding, Fig. 5.6 displays both a magnetogram with complex morphology (panel b) and its corresponding persistence diagram (panel a), along with three zoomed-in regions of the magnetogram (panels c to e). In all panels, some topological features or their corresponding magnetic structures have been color-coded based on their types, or equivalently, based on their positions in the persistence diagram. In the complete magnetogram (panel

b), structures have been marked with a cross, indicating the pixel where the structure died during the filtration process. Meanwhile, in panels c to e, all pixels composing each structure have been colored. It is noteworthy that nearly all pixels appear colored because we have selected the most significant structures—those with longer lifetimes (Eqn. (5.6)). Consequently, these structures encompass all less significant structures that are absorbed and incorporated into the former during the filtration process.

The analysis of the persistence diagram allows us to deduce several properties of the magnetogram. Firstly, the persistence diagram provides a rapid assessment of the intensity of the magnetic flux since the death value of the topological feature coincides with the maximum flux (in absolute value) within the corresponding structure. In the case of Figure 5.6, we observe that several structures exhibit maximum (absolute) values surpassing 1500 G, with multiple structures falling within the range of 1000 G to 1500 G.

Secondly, we can infer how the magnetic signals are distributed by examining the number of isolated and connected structures in the diagram (structures highlighted in blue and red depending on their polarity in Fig. 5.6). The complex morphology of the structure displayed in the magnetogram is evident in the high number of connected structures (regions II and V in the diagram) and the absence of prominent isolated structures (regions I and IV).

Lastly, the presence or absence of ring-like structures provides insights into how the magnetic structures are connected. These features can only be found in regions where connected structures create highly complex morphologies with gaps between them, as illustrated in the magnified regions of the magnetogram in Figure 5.6 (panels c to e).

An example of how the three features allow us to classify ARs depending on their morphologies is shown in Figure 5.7, where three different ARs and their corresponding PIs are displayed. Although at first sight, the PIs appear to be very similar, especially the ones shown in panels d) and f), upon closer inspection, it is possible to find the differences when focusing on the three features mentioned previously. The first AR (panel a)), also shown in Fig. 5.6, shows a very complex morphology, where the magnetic field of both positive and negative polarities is distributed in multiple connected structures. This behavior is displayed in the PI through the high density in the isolated and connected features in equal proportions (i.e. with no prominent features) and with the presence of ring-like features in both polarities. In contrast, the second AR (panel b) shows a simpler magnetic structure with weaker signals. The PI for this case shows an absence of ring-like features in both polarities and a very low density in the regions for connected and isolated features. Lastly, panel c) shows an AR where the positive magnetic field is concentrated in one main area whereas the negative polarity magnetic field shows a fragmented structure. Comparing the corresponding PI with that of the initial case (panels f and d, respectively), a similarity is evident in the region corresponding to negative polarities, observed in both the density of connected components and the presence of ring-type structures. Nevertheless, when examining the positive polarity, it becomes evident that, unlike its negative counterpart, there are only a few prominent isolated structures and a notably low density of connected structures. Furthermore, this asymmetry between the positive and negative distributions is underscored by the absence of ring-like structures in the former.

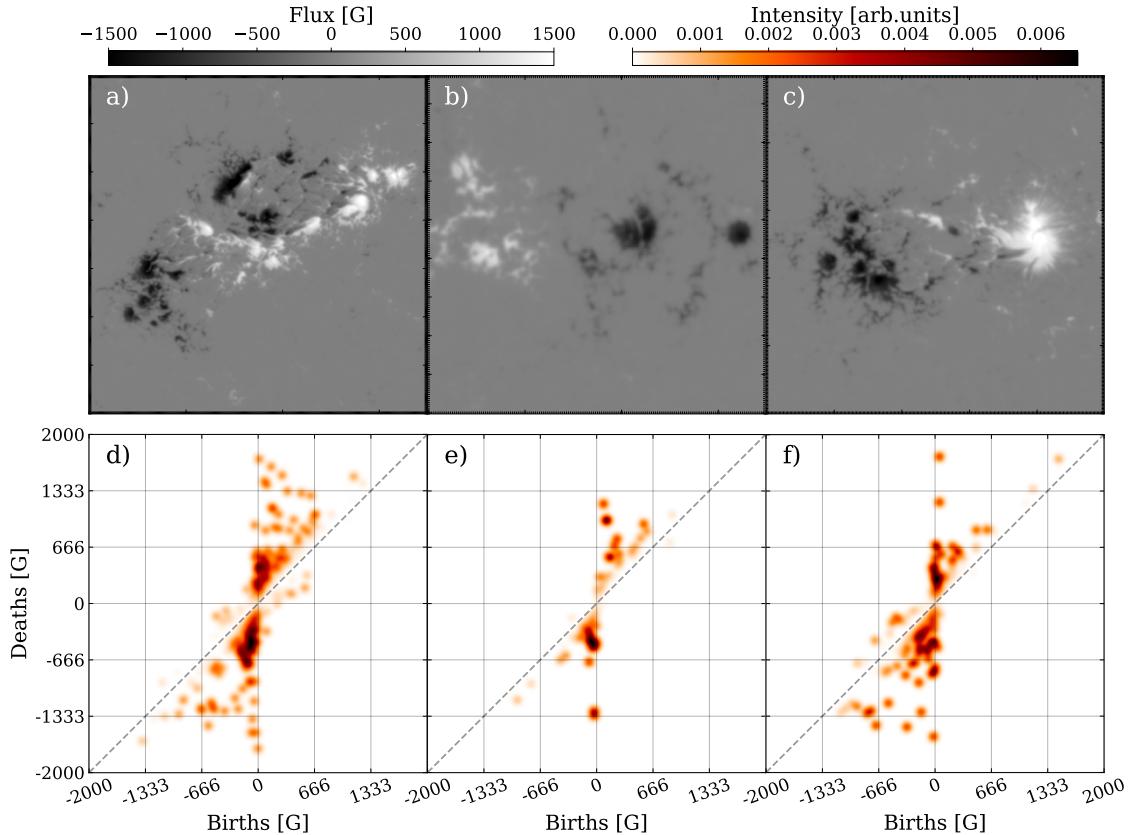


Figure 5.7 SDO/HMI magnetograms of three different active regions and their corresponding persistence images. a) NOAA AR 11158, date: 2011-02-13 at 06:34. b) NOAA AR 11098, date: 2010-08-12 at 20:58. c) NOAA AR 11072, date: 2010-05-22 at 20:58. All persistence images have been generated with the following parameters: Resolution = 1000 pixels<sup>2</sup> (4 G), weighting function:  $\omega(\pi) = \arctan(5 \times 10^{-8} \pi^3)$  and a gaussian kernel with  $\sigma = 40$  G.

#### 5.1.4.3 ‘Interacting’ Diagram

So far, we have shown how persistent homology is capable of identifying the various morphologies of active regions and the types of structures that can be identified through persistent images or diagrams. Nevertheless, these structures are either isolated or regions of the same polarity that interact with each other. Due to the nature of the filtration process, persistent homology is unable to detect structures where magnetic fields of opposite polarities form a joint structure. However, ARs where there is a significant interaction between magnetic fields of opposite polarities are of greater interest due to their association with flare production.

This issue is illustrated in the analysis carried out in the previous section of NOAA Active Region 11158 (see Fig. 5.6). Although we can capture the complexity of both positive and negative magnetic structures through the persistent diagram, the  $\delta$ -spots present in the central region remain unnoticed. However, the large number of flare events associated with

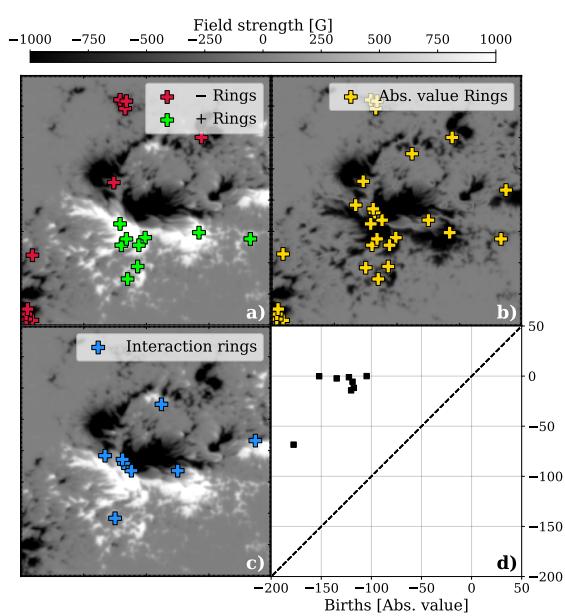


Figure 5.8 Depiction of the different steps carried out for the generation of the interaction diagram (panel d)) for a zoomed-in region of an SDO/HMI magnetogram of NOAA AR 11158 observed on the 2011-02-13 at 18:34. The crosses point to the position at which each of the ring-like structures die, which is always located inside the perimeter of the hole. Panel a) shows the original magnetogram and the position where rings of positive and negative polarities are found. Panel b) shows the magnitude of the field strength in negative values along with the rings found in this representation. Panel c) shows the original magnetogram again, but now featuring the interaction rings, identified when comparing the position of the rings found in the previous steps. Lastly, panel d) shows the ‘interaction diagram’ generated using only the interacting ring structures.

this region including an X2.2-class event are thought to be related to the abundance of these structures (e.g. Sun et al. 2012, Toriumi et al. 2014b). In this section, we describe a way to efficiently detect and quantify these structures using persistence homology, with only a few additional steps in the analysis.

We start by tracking the position in the magnetogram where rings are detected. Following this, we modify the magnetogram by inverting the sign of one polarity, ensuring that all pixels are either negative or positive. This way, we construct a second ‘magnetogram’ in which we only have information about the intensity, in absolute value, of the magnetic field. This allows us to identify features formed by any combination of signals, whether they are of the same polarity or opposite. Using this new magnetogram, we repeat the analysis and record the positions in the magnetograms at which we find ring-like features. It is worth noting that in this analysis, all the rings identified in the initial step, which were formed by structures of equal polarities, are still detected, although their position in the persistent diagram may have changed due to the change in polarity, hence the relevance of tracking the pixel in the magnetograms. However, only in this second analysis can we identify rings formed between opposite polarities. By selectively considering the ring-like features exclusively identified in this second analysis, we can effectively identify and characterize the structures that are formed by the interaction between different polarities.

Figure 5.8 depicts an example of the interaction analysis for NOAA AR 11158, which exhibits a strong interaction between opposite-polarity fields. Panel a) displays the magnetogram, indicating also the positions where ring-like features have been identified for both

positive and negative polarities. Only features with absolute persistencies greater than  $5\sigma_{bg}$  and whose birth occurs in the range:  $(5\sigma_{bg}, \infty)$ , for positive polarities, and:  $(-\infty, -5\sigma_{bg})$  for negative polarities, have been recorded. We now repeat the same analysis but using only the magnitude of the signal. To do this, we invert the positive polarity and, once again, register the positions of the ring-like features in this new magnetogram, as shown in panel b). As observed in panel c), the majority of the interaction rings (*i.e.* those exclusively identified in the second analysis) are located in areas characterized by strong interaction, where the  $\delta$ -spots were found. In these areas, both polarities interact, resulting in the formation of ring-like structures comprising positive and negative magnetic fields due to their close proximity. These areas, such as  $\delta$ -spots, are of particular interest, as they typically harbor magnetic cancellation, reconnection, and flux emergence. However, some points appear to be situated in uni-polar fields. These points, despite what may appear at first sight, are found by this analysis due to a structure that requires the other polarity to close completely and thus form a ring. It is noteworthy that the occurrences of such cases are quite limited when compared to the rings observed in highly interacting zones. While their presence does not necessarily indicate intense interaction, it does imply a certain level of interaction between the two polarities. These features can be represented in a persistence diagram in an analogous way to the standard results of a persistent homology analysis. This is what we have referred to as ‘interacting diagram’ and it is worth noting that only the magnitude of the birth and death coordinates are relevant parameters since the sign will be the one matching the polarity selected at the second step. We have chosen to invert the positive polarity so that these features have positive persistencies, as it is more common in persistent homology studies. However, it is important to emphasize that this decision is completely arbitrary and has no impact on the results of the analysis.

It is useful to determine the information conveyed by the interaction diagram regarding the structures themselves. By taking into account the position and quantity of the interaction rings, along with the temporal evolution of the diagram, we can discern the moment and location where these highly interacting structures develop. Therefore, interaction diagrams could be a new tool to identify, through their topological properties, the strong-gradient polarity inversion lines that characterize  $\delta$ -spots. To achieve this, it is necessary to incorporate into the analysis the temporal evolution of these structures and study the properties that can be extracted from the  $\delta$ -spots through these diagrams, which goes beyond the scope of this work but represents the next (necessary) step to asses the predicting capabilities of persistent homology in the field of solar physics.

## CHAPTER 6

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# CONCLUSIONS

In this manuscript we have provided a thorough overview of the entire process required to achieve scientific solar observations and subsequent data analysis. This journey begins with the design and calibration of TuMag, the tunable magnetograph aboard the Sunrise III observatory, and continues with a detailed description of the data reduction pipeline. Preliminary results of the data processing are also presented after the Sunrise III successful flight in 2024. Then, we highlighted some of the challenges that arise during the reduction of FPI-based spectrometers with a special interest on the cavity map correction in telecentric setups. And lastly it concluded with an example of scientific data exploitation, employing the persistent homology technique to study solar magnetograms.

The fundamental pillar that holds a significant amount of the work of this thesis is the observation campaign for the third flight of the Sunrise observatory and the extensive preparations leading up to it. In particular, I have been involved in all calibration phases of TuMag, including the three AIV phases conducted before the planned 2022 flight at INTA in Madrid, MPS in Göttingen, and Esrange in Kiruna, as well as the corresponding phases before the successful 2024 flight. During the final stages of calibration, much of my effort focused on preparing the observations, calibrating the observation modes, and planning the operations. Additionally, I actively participated in the intensive observing campaign during the 2024 flight. While only part of this work is explicitly detailed in this manuscript, these activities have constituted the majority of my efforts over the past four years.

In the end, all subsystems of the Sunrise observatory performed nearly flawlessly throughout the six-day campaign, delivering several terabytes of high-quality data to reduce and analyze. While processing this data will likely take months, we have aimed to offer an initial look at TuMag's output and demonstrate the potential of its observations. In total, the campaign yielded ten terabytes of TuMag's data, combining science observations and calibrations. The main steps of the pipeline were ready when the data arrived, even if it is still in development to account for issues found and complete some remaining steps, thus, the data-reduction process started the moment we got access to the data and the preliminary results shown in chapter 3 are proof of the exceptional performance of the instrument. TuMag's spectral, optical and polarimetric performances are as expected. The first image reconstructions have shown that we are able to deconvolve the PSF and enhance the spatial resolution for all datasets that have been analyzed. Spectrally, TuMag does not show

any abnormal behaviour. The main challenge being the correction of the pre-filter and the removal of the second-order contamination, which is a correction that we plan to tackle soon. Regarding the polarimetric performance, the results show that we are able to derive the Stokes components with a sensitivity fulfilling the requirements. Nonetheless, a thorough analysis of the micropolarizers and linear polarizer observations is pending to accurately assess and correct the presence cross-talk.

Overall, TuMag's data is highly promising. With its high-resolution data of long and uninterrupted series with a high temporal cadence, comprising various targets, spectral lines, and strong polarimetric sensitivity, combined with the data from SCIP and SUSI, Sunrise holds the potential for groundbreaking solar science.

The need for months to properly prepare the raw data for scientific use originates from the fact that many corrections require a careful application and most of the time manual intervention to guarantee that the corrections were applied successfully. Hence, the pipeline, as of today, cannot be fully automated without a thorough initial assessment. In order to provide a better understanding of this topic, in chapter 4 we have explored the challenges that arise in the data reduction of FPI-based spectrometers, specifically those employing telecentric setups. Equipped with the analytical modelling of the FPIs, we have been able to address the impact of the etalon defects on the observations. We have quantified the error in the computations of LOS velocities and magnetic fields when the cavity errors are (only) partially corrected through the simulation of an observation of a Sunspot. Additionally, we have provided a new strategy for the data correction of etalon-based spectrometers that separates the effects of the FPIs on the flat-fields from other effects in an attempt to improve the flat-field correction. Lastly, we have tested the performance of this new method on a series of simulated observations and real data to verify its applicability.

The simulation of the sunspot observation in section 4.2 demonstrates the significant impact of improperly corrected cavity errors on the physical measurements. The discussion is centered around the flat-fielding procedure, which presents one of the main challenges in these setups, as cavity errors also affect flat-field observations. We show that these flat-fields alter and distort the observed spectral profiles when applied. The correlation between the structures found in the velocity calculation errors after flat-field correction and those of the cavity map suggests that the flat-fielding has not (fully) corrected these errors. In the penumbra, errors can reach up to  $400 \text{ ms}^{-1}$  for both flat-fielding approaches, which would invalidate any measurements, as penumbral flows are of similar magnitudes.

Furthermore, we found that the shape of the transmission profile affects the measurements, with velocities derived using an asymmetrical transmission profile differing from those obtained with a symmetrical one. This, combined with the distinct behavior of the umbra compared to the rest of the field of view (FoV), implies that these measurements are sensitive to both the shape of the transmission profile and the spectral profile of the object.

Similar effects are observed in the magnetic field calculations, where the error structures correspond to those of the cavity map. However, in the case of magnetic fields, this effect is less significant, as the error values are small relative to the observed values (3 G of error in a 100 G field).

These results motivate the pursuit of methods to account for and correct these effects.

One such method is the algorithm we developed to disentangle the FPI-based spurious effects on the flat-fields from those of other origins. The method, presented in Section 4.3, is capable of extracting the cavity map from the observations by employing the analytical modeling of the FPIs in different configurations.

We evaluated the performance of the algorithm through a series of simulated tests designed to assess various key aspects of its applicability to real data. In the first place, the performance of the algorithm was tested as a function of the S/N of the observations, the spectral sampling, and the configuration of the etalon, assuming the spectrum of the object is known. We also studied the possibility of deriving the observed object from the data through a deconvolution process. We tested the performance of this approach as a function of the spectral sampling. Finally, we simulated a scenario in which the etalon configuration was different from the real one. The aim of these tests was to assess the impact of neglecting some properties of the etalon, such as the asymmetries in telecentric imperfect scenarios.

The algorithm has shown a high sensitivity to the noise level of the data. Nonetheless, the worst-case scenario considered in this work corresponds to much worse performances than current instruments can achieve in terms of S/N, and the errors are still within the necessary limits. In addition, the performance of the algorithm is the same for regions of the FoV where the etalon properties are far from their nominal values and regions where there is no deviation of the etalon properties.

Results for the three different optical configurations of the etalon are very similar. The telecentric configuration showed a worse performance than the collimated one in terms of cavity map retrieval. The loss of precision is nonetheless very small, below  $\sim 5 \text{ ms}^{-1}$  in most cases.

The deconvolution of the object during the calculations was shown to yield a performance close to the ideal case in terms of cavity map determination. The performance when computing the gain showed a different behavior, although the average error never exceeds 0.4%. Concerning the dependence on the spectral sampling, the results show that with a scanning of at least six points, the additional error of deconvolving the object will not be larger than  $25 \text{ ms}^{-1}$ . Overall, we estimated a total error smaller than  $100 \text{ ms}^{-1}$  for the worst-case scenario, where only five wavelengths are used to scan the line using the deconvolution approach for an S/N of 200.

In real instruments, light travels through different optical elements before reaching the etalon. Along this light path, the observed object might be modified in such a way that it no longer resembles a fixed reference. It is in fact very difficult to assess the error associated with this assumption (i.e., assuming that the object reaching the etalon is that of the FTS atlas profile) since these deviations cannot be measured. By deriving the object from the data, we expect additional errors due to the deconvolution process of around  $10 \text{ ms}^{-1}$ , which we expect to be smaller than the ones produced by selecting a fixed object that differs considerably from the real one. Additionally, the deconvolution of the object allowed us to apply the algorithm to data where a solar structure is partly present.

Knowledge of the exact shape of the transmission profile has proven to be relevant to ensuring the accuracy of the algorithm. The results obtained for the crossover scenario have demonstrated that approximating the FPI's transmission profile by another can serve

as a first-order approximation. However, the determination of the gain has proven to be much more sensitive to changes in the transmission profile. The errors observed in the crossover scenario are higher overall than those of the ideal case. In addition, the unaccounted asymmetries of the imperfect configuration paradoxically increase the error when improving the spectral sampling.

The results obtained when applying the algorithm to observations from SO/PHI reinforce the validity of the algorithm. Indeed, we have been able to extract the contribution of the cavity map from the flat-field observations. Comparison of the derived cavity map with lab measurements suggests that the algorithm can successfully extract the cavity map from the flat-field observations. In future works, we aim to allow the algorithm to modify the angle of incidence across the FoV and validate the results by implementing them in the SO/PHI pipeline.

Only after the data has been meticulously reduced and all instrumental effects are removed can the observations be reliably used for scientific purposes. We aimed at providing a brief example of such a study with already reduced spectropolarimetric data in chapter 5. In this chapter, we present a study where we investigate the most adequate approach for the application of persistent homology algorithms to the analysis of solar magnetograms. By combining different filtrations in a single one-dimensional persistent homology analysis, we can effectively capture structures corresponding to both polarities of the magnetic field. We have applied this analysis to observations of the quiet Sun and active regions, taken with both Hinode/SOT and SDO/HMI, respectively. Lastly, we have analyzed the results and identified the features of the data that can be found through persistent diagrams and images, and also show some examples of applications of the algorithms.

Our proposed approach to persistent homology algorithms involves the integration of sublevel and superlevel filtrations within a single analysis, enabling the creation of a comprehensive persistence diagram that encompasses features from both positive and negative magnetic structures. Through the examination of the positions of these identified features within the resulting persistence diagram, we can discern the diverse magnetic features present in the magnetograms. This approach has demonstrated its efficacy in capturing the intricate complexity of magnetic structures, with a particular emphasis on active regions. Through this method, we have achieved successful differentiation between the various morphologies present in active regions by analyzing the presence or absence of specific features in the corresponding persistence images.

On the other hand, the persistent images obtained from quiet Sun observations exhibit significant similarity to each other. This indicates a lack of overall evolution in the magnetic structures within these regions. In quiet Sun areas, small regions of magnetic flux interact with each other in small-scale events, while the overall structure remains relatively static. These small-scale events become more apparent in persistent images when the field of view is reduced. These small-scale events, such as flux emergence or cancellation, can be observed through persistent images as a joint movement of negative and positive features. In cancellation events, the features move toward the center of the image, while in emergence events, they move away from the center.

Additionally, we have successfully identified interactions between opposite-polarity

magnetic fields by detecting ring-like features formed by these two polarities. To achieve this, we introduced a method for calculating an ‘interaction diagram’ that selectively displays features resulting from the interaction between polarities. This interaction diagram is generated by comparing the ring-like features identified in an analysis using only the absolute value of the signal with those found in the standard analysis. This approach enables us to detect the presence of  $\delta$ -spots and quantify the level of interaction between polarities, which is one of the critical factors for the understanding and prediction of flare eruptions.

In conclusion, our application of persistent homology to solar magnetograms has provided a comprehensive and insightful framework for studying magnetic structures on the solar surface. The topological features derived from magnetograms serve as a foundation for classifying active regions based on their morphology and level of interaction, as certain topological features may have inherent connections to solar atmospheric phenomena. For instance, the presence of interaction rings in active regions might be correlated with flare production, while the interaction of signals from opposite polarities observed in a persistent diagram in the quiet Sun could be linked to small-scale reconnection events or the separation of signals associated with flux emergence. The exploration of these relationships and the assessment of the presented tools in achieving precise active region classification and their potential as predictive tools are topics of our upcoming research. Moreover, we have introduced new tools, such as the interaction diagram, which facilitates the detection and quantification of structures interacting with opposite polarities, like  $\delta$ -spots, addressing a crucial aspect of flare prediction. The findings presented in this article lay a solid foundation for future studies, emphasizing the potential of persistence images as valuable inputs for machine learning algorithms and contributing to advancements in space weather forecasting.

Lastly, it is important to emphasize that in this study we have focused primarily on static images in order to provide a solid basis for future investigations. The next logical step in this study is to complete the analysis of active regions, which includes examining their temporal evolution. This approach allows for the simultaneous consideration of two key factors in understanding flare eruption processes: morphological complexity, whose analysis is intrinsic to persistent homology, and the study of their temporal evolution through the analysis of the evolution of persistence and interaction diagrams.

In summary, this thesis presents the complete process of solar data acquisition and analysis, covering all the essential steps: from instrument design and calibration to operations and data reduction. Going through the challenges encountered during data reduction to ensure data quality and, finally, providing a brief example of data analysis using science-ready data.

The work on TuMag’s calibration and operations provided an opportunity to engage deeply with the extensive preparation required before conducting scientific observations, a process that often spans several years for any astronomical instrument. This preparation is critical for the success of observation campaigns like Sunrise, which, in turn, generate large datasets requiring significant effort to prepare for scientific analysis. This thesis sought to highlight the importance of these foundational steps in any astronomical discovery, as errors in calibration or data reduction can compromise the validity of the analysis. For

TuMag, the data reduction process is ongoing, and the culmination of several years of effort is expected to produce its results in the near future.

The study of FPI-based interferometers allowed us to deepen our understanding of the instrumental artifacts we see in the data, and helps us to improve our corrections. The study of the sunspot observation highlighted the importance of carefully addressing cavity-induced errors in the observations. The fitting algorithm developed to tackle this problem has proven to yield good results although some additional improvements will be applied to enhance its performance in real data. Lastly, the study of persistent homology techniques applied for solar physics allowed us to offer a glimpse of data analysis, employing a completely novel technique for solar physics that may open the door to new automatic feature detection in solar magnetograms.

## APPENDIX: PROFILE DERIVATIVES

In this appendix, we present the derivatives of the merit function (4.15), which are required for calculating the Hessian and Jacobian matrices for the algorithm presented in section 4.3. Additionally, we provide the derivatives of the transmission profile for both the collimated and perfect telecentric configurations.

We show the derivatives of the merit function with respect to  $\Delta a$  and  $g$ , since these are the parameters employed in the algorithm. These derivatives are the following:

$$\frac{\partial f(\Delta a, g)}{\partial \Delta a} = \sum_{s=0}^{N_\lambda} \left\{ -g \left[ \frac{\int \partial_{\Delta a} \Psi^{\lambda_s}(\lambda, \Delta a) O(\lambda) d\lambda \int \Psi^{\lambda_c}(\lambda, \Delta a) O(\lambda) d\lambda}{\left( \int \Psi^{\lambda_c}(\lambda, \Delta a) O(\lambda) d\lambda \right)^2} - \right. \right. \\ \left. \left. \frac{\int \Psi^{\lambda_s}(\lambda, \Delta a) O(\lambda) d\lambda \int \partial_{\Delta a} \Psi^{\lambda_c}(\lambda, \Delta a) O(\lambda) d\lambda}{\left( \int \Psi^{\lambda_c}(\lambda, \Delta a) O(\lambda) d\lambda \right)^2} \right] \right\}, \quad (1)$$

and,

$$\frac{\partial f(\Delta a, g)}{\partial g} = \sum_{s=0}^{N_\lambda} \left( -\frac{\int \Psi^{\lambda_s}(\lambda, \Delta a) O(\lambda) d\lambda}{\int \Psi^{\lambda_c}(\lambda, \Delta a) O(\lambda) d\lambda} \right), \quad (2)$$

where we have used the notation  $\partial_{\Delta a} := \partial/\partial \Delta a$  for simplicity.

The derivatives for the transmission profiles with respect to  $\Delta a$  are

$$\frac{\partial \Psi^{\lambda_s}(\Delta a)}{\partial \Delta a} = -\frac{8\pi a R (-1 + R)^2 \sin(4\pi a \Delta a / \lambda)}{\lambda (1 + R^2 - 2R \cos^2(4\pi a \Delta a / \lambda))^2}, \quad (3)$$

for the collimated case, and,

$$\frac{\partial \Psi^{\lambda_s}(a(\Delta a))}{\partial \Delta a} = \frac{\Psi^{\lambda_s}(a(\Delta a))}{\partial a} \frac{\partial a}{\partial \Delta a} = 2 \left( \Re [E(a(\Delta a))] \frac{\partial \Re [E(a(\Delta a))]}{\partial a} + \right. \\ \left. \Im [E(a(\Delta a))] + \frac{\partial \Im [E(a(\Delta a))]}{\partial a} \right) \frac{\partial a}{\partial \Delta a}, \quad (4)$$

for the perfect telecentric configuration. The derivatives for the real and imaginary parts of  $E(a(\Delta a))$  are

$$\frac{\partial \Re e [E(a(\Delta a))]}{\partial a} = \frac{2\sqrt{\tau}}{\alpha_1} \left[ \frac{\alpha'_1}{\alpha_1} (\arctan \gamma_2 - \arctan \gamma_1) + \frac{\gamma'_1}{1+\gamma_1^2} - \frac{\gamma'_2}{1+\gamma_2^2} \right], \quad (5)$$

and,

$$\begin{aligned} \frac{\partial \Im m [E(a(\Delta a))]}{\partial a} = & \frac{2\sqrt{\tau}}{\alpha_2} \frac{1+R}{1-R} \left[ \frac{\alpha'_2}{\alpha_2} \left\{ \ln \left( \frac{(1+\gamma_3)^2 + \gamma_5^2}{(1-\gamma_3)^2 + \gamma_5^2} \right) - \ln \left( \frac{(1+\gamma_3)^2 + \gamma_4^2}{(1-\gamma_3)^2 + \gamma_4^2} \right) \right\} + \right. \\ & \left. \frac{8\gamma_3\gamma_5\gamma'_5}{[(1+\gamma_3)^2 + \gamma_5^2] [(1-\gamma_3)^2 + \gamma_5^2]} - \frac{8\gamma_3\gamma_4\gamma'_4}{[(1+\gamma_3)^2 + \gamma_4^2] [(1-\gamma_3)^2 + \gamma_4^2]} \right], \end{aligned} \quad (6)$$

with the derivatives of the  $\alpha_n$  and  $\gamma_n$  parameters being

$$\begin{aligned} \alpha'_1 &= 2b\sqrt{F}, \\ \alpha'_2 &= 4b\sqrt{F(F+1)}, \\ \gamma'_1 &= \sqrt{F} \cos(a_s(\Delta a)), \\ \gamma'_2 &= \sqrt{F}(1-b) \cos(a_s(\Delta a)[1-b]), \\ \gamma'_4 &= \frac{1-b}{2\sqrt{F+1}} \sec^2 \left( \frac{a_s(\Delta a)}{2}[1-b] \right), \\ \gamma'_5 &= \frac{1}{2\sqrt{F+1}} \sec^2 \left( \frac{a_s(\Delta a)}{2} \right). \end{aligned} \quad (7)$$

## BIBLIOGRAPHY

- Abbott, B. P., Abbott, R., Abbott, T., et al. Observation of gravitational waves from a binary black hole merger. *Physical review letters* **116**, 061102 (2016).
- Abramenko, V. Relationship between magnetic power spectrum and flare productivity in solar active regions. *The Astrophysical Journal* **629**, 1141 (2005).
- Abramenko, V., & Yurchyshyn, V. Intermittency and multifractality spectra of the magnetic field in solar active regions. *The Astrophysical Journal* **722**, 122 (2010).
- Abramenko, V. I., & Yurchyshyn, V. B. Analysis of quiet-sun turbulence on the basis of sdo/hmi and goode solar telescope data. *Monthly Notices of the Royal Astronomical Society* **497**, 5405 (2020).
- Adams, H., Emerson, T., Kirby, M., et al. Persistence images: A stable vector representation of persistent homology. *Journal of Machine Learning Research* **18**, 1 (2017).
- Aktas, M. E., Akbas, E., & Fatmaoui, A. E. Persistence homology of networks: methods and applications. *Applied Network Science* **4**, 1 (2019).
- Álvarez-Herrero, A., Belenguer, T., Pastor, C., et al. Lithium niobate fabry-perot etalons in double-pass configuration for spectral filtering in the visible imager magnetograph imax for the sunrise mission. *Space Telescopes and Instrumentation I: Optical, Infrared, and Millimeter*, SPIE, 797–812 (2006).
- Álvarez-Herrero, A., Parejo, P. G., & Silva-López, M. Fine tuning method for optimization of liquid crystal based polarimeters. *Optics Express* **26**, 12038 (2018).
- Álvarez-Herrero, A., Parejo, P. G., & Silva-López, M. Fine tuning method for optimization of liquid crystal based polarimeters. *Optics Express* **26**, 12038 (2018).
- Álvarez Herrero, A., Garranzo-García, D., Núñez, A., et al. End-to-end tests of the tumag instrument for the sunrise iii mission. *Ground-based and Airborne Instrumentation for Astronomy IX*, SPIE, 791–802 (2022).
- Bahauddin, S. M., & Rast, M. P. Identifying acoustic wave sources on the sun. i. two-dimensional waves in a simulated photosphere. *The Astrophysical Journal* **915**, 36 (2021).

- Bailén, F. J., Orozco Suárez, D., Blanco Rodríguez, J., & del Toro Iniesta, J. C. Performance of Sequential Phase Diversity with Dynamical Solar Scenes. *Astrophys. J. Suppl.* **263**, 7 (2022).
- Bailén, F. J., Orozco Suárez, D., & del Toro Iniesta, J. Fabry-pérot etalons in solar astronomy. a review. *Astrophysics and Space Science* **368**, 55 (2023).
- Bailén, F. J., Suárez, D. O., & del Toro Iniesta, J. On fabry-pérot etalon-based instruments. i. the isotropic case. *The Astrophysical Journal Supplement Series* **241**, 9 (2019).
- Bailén, F. J., Suárez, D. O., & del Toro Iniesta, J. On fabry-pérot etalon-based instruments. ii. the anisotropic (birefringent) case. *The Astrophysical Journal Supplement Series* **242**, 21 (2019).
- Bailén, F. J., Suárez, D. O., & del Toro Iniesta, J. On fabry-pérot etalon-based instruments. iii. instrument applications. *The Astrophysical Journal Supplement Series* **246**, 17 (2020).
- Bailén, F. J., Suárez, D. O., & del Toro Iniesta, J. On fabry-pérot etalon-based instruments. iv. analytical formulation of telecentric etalons. *The Astrophysical Journal Supplement Series* **254**, 18 (2021).
- Barnes, D., Polanco, L., & Perea, J. A. A comparative study of machine learning methods for persistence diagrams. *Frontiers in Artificial Intelligence* **4**, 681174 (2021).
- Barthol, P., Gandorfer, A., Solanki, S. K., et al. The sunrise mission. *Solar Physics* **268**, 1 (2011).
- Beckers, J. On the effect of narrow-band filters on the diffraction limited resolution of astronomical telescopes. *Astronomy and Astrophysics Supplement Series* **129**, 191 (1998).
- Bellot Rubio, L., & Orozco Suárez, D. Quiet sun magnetic fields: an observational view. *Living Reviews in Solar Physics* **16**, 1 (2019).
- Bendich, P., Marron, J. S., Miller, E., Pieloch, A., & Skwerer, S. Persistent homology analysis of brain artery trees. *The annals of applied statistics* **10**, 198 (2016).
- Bobra, M. G., Sun, X., Hoeksema, J. T., et al. The helioseismic and magnetic imager (hmi) vector magnetic field pipeline: Sharps-space-weather hmi active region patches. *Solar Physics* **289**, 3549 (2014).
- Brault, J., & Neckel, H. Spectral atlas of solar absolute disk-averaged and disk-center intensity from 3290 to 12510 Å. *unpublished (tape-copy from KIS IDL library)* (1987).
- Bubenik, P., et al. Statistical topological data analysis using persistence landscapes. *J. Mach. Learn. Res.* **16**, 77 (2015).
- Cavallini, F. Ibis: a new post-focus instrument for solar imaging spectroscopy. *Solar Physics* **236**, 415 (2006).

- Childlaw, R., Devaney, A., & Gonsalves, R. Analytical studies of phase estimation techniques, volume 1. *Final Technical Report* (1979).
- Chung, Y., & Lawson, A. Persistence curves: a canonical framework for summarizing persistence diagrams. arxiv. *arXiv preprint arXiv:1904.07768* (2019).
- Clough, J. R., Byrne, N., Oksuz, I., et al. A topological loss function for deep-learning based image segmentation using persistent homology. *IEEE transactions on pattern analysis and machine intelligence* **44**, 8766 (2020).
- Cohen-Steiner, D., Edelsbrunner, H., & Harer, J. Stability of persistence diagrams. *Proceedings of the twenty-first annual symposium on Computational geometry*, 263–271 (2005).
- Collados, M. High resolution spectropolarimetry and magnetography. *Third Advances in Solar Physics Euroconference: Magnetic Fields and Oscillations*, 3–22 (1999).
- Danilovic, S., Rempel, M., van Noort, M., & Cameron, R. Observed and simulated power spectra of kinetic and magnetic energy retrieved with 2d inversions. *Astronomy & Astrophysics* **594**, A103 (2016).
- Danilovic, S., Beeck, B., Pietarila, A., et al. Transverse component of the magnetic field in the solar photosphere observed by sunrise. *The Astrophysical Journal Letters* **723**, L149 (2010).
- Davis, R., Harmer, D. S., & Hoffman, K. C. Search for Neutrinos from the Sun. *PhRvL* **20**, 1205 (1968).
- DeForest, C., Hagenaar, H., Lamb, D., Parnell, C., & Welsch, B. Solar magnetic tracking. i. software comparison and recommended practices. *The Astrophysical Journal* **666**, 576 (2007).
- del Toro Iniesta, J., Orozco Suárez, D., Álvarez-Herrero, A., et al. Tumag: the tunable magnetograph for the sunrise iii mission. *In preparation.* (2025).
- del Toro Iniesta, J. C. (2003), Introduction to spectropolarimetry (Cambridge university press).
- del Toro Iniesta, J. C., & Collados, M. Optimum modulation and demodulation matrices for solar polarimetry. *Applied Optics* **39**, 1637 (2000).
- del Toro Iniesta, J. C., & Ruiz Cobo, B. Inversion of the radiative transfer equation for polarized light. *Living Reviews in Solar Physics* **13**, 4 (2016).
- Deshmukh, V., Baskar, S., Berger, T., Bradley, E., & Meiss, J. Comparing feature sets and machine-learning models for prediction of solar flares-topology, physics, and model complexity. *Astronomy & Astrophysics* **674**, A159 (2023).

- Edelsbrunner, H., & Harer, J. L. (2022), Computational topology: an introduction (American Mathematical Society).
- Elmore, D. F., Lites, B. W., Tomczyk, S., et al. Advanced stokes polarimeter: a new instrument for solar magnetic field research. *Polarization analysis and measurement*, SPIE, 22–33 (1992).
- Evershed, J. Radial movement in sunspots. *The Observatory* (1909).
- Feller, A., Gandorfer, A., Korpi-Lagg, A., et al. Susi: The sunrise spectropolarimeter and imager. *In preparation*. (2025).
- Gandorfer, A., Grauf, B., Barthol, P., et al. The filter imager sufi and the image stabilization and light distribution system islid of the sunrise balloon-borne observatory: instrument description. *Solar Physics* **268**, 35 (2011).
- Gaskill, J. D. (1978), Linear systems, Fourier transforms, and optics, Vol. 56 (John Wiley & Sons).
- Georgoulis, M. K., & Rust, D. M. Quantitative forecasting of major solar flares. *The Astrophysical Journal* **661**, L109 (2007).
- Gizon, L., Birch, A. C., & Spruit, H. C. Local helioseismology: three-dimensional imaging of the solar interior. *Annual Review of Astronomy and Astrophysics* **48**, 289 (2010).
- Gonsalves, R. A. Phase retrieval and diversity in adaptive optics. *Optical Engineering* **21**, 829 (1982).
- González, N. B., & Kneer, F. Narrow-band full stokes polarimetry of small structures on the sun with speckle methods. *Astronomy & Astrophysics* **480**, 265 (2008).
- Gošić, M., Rubio, L. B., Suárez, D. O., Katsukawa, Y., & del Toro Iniesta, J. The solar inter-network. i. contribution to the network magnetic flux. *The Astrophysical Journal* **797**, 49 (2014).
- Green, S. B., Mintz, A., Xu, X., & Cisewski-Kehe, J. Topology of our cosmology with persistent homology. *Chance* **32**, 6 (2019).
- Guglielmino, S., Pillet, V. M., Bonet, J., et al. The frontier between small-scale dipoles and ephemeral regions in the solar photosphere: emergence and decay of an intermediate-scale dipole observed with sunrise/imax. *The Astrophysical Journal* **745**, 160 (2012).
- Guizar-Sicairos, M., Thurman, S. T., & Fienup, J. R. Efficient subpixel image registration algorithms. *Optics letters* **33**, 156 (2008).
- Hale, G. E., Ellerman, F., Nicholson, S. B., & Joy, A. H. The magnetic polarity of sun-spots. *Astrophysical Journal, vol. 49, p. 153* **49**, 153 (1919).

- Helstrom, C. W. Image restoration by the method of least squares. *Josa* **57**, 297 (1967).
- Hensel, F., Moor, M., & Rieck, B. A survey of topological machine learning methods. *Frontiers in Artificial Intelligence* **4**, 681108 (2021).
- Hotta, H., Rempel, M., & Yokoyama, T. Efficient small-scale dynamo in the solar convection zone. *The Astrophysical Journal* **803**, 42 (2015).
- Huang, K.-Y., Chia, C.-M., & Chang, E. Optical resolution measurement system for small lens by using slanted-slit method. *Optical Measurement Systems for Industrial Inspection VIII*, SPIE, 705–712 (2013).
- Katsukawa, Y. Scip: The sunrise cromospheric infrared spectro-polarimeter. *In preparation.* (2025).
- Katsukawa, Y., & Orozco Suárez, D. Power spectra of velocities and magnetic fields on the solar surface and their dependence on the unsigned magnetic flux density. *The Astrophysical Journal* **758**, 139 (2012).
- Kentischer, T., Schmidt, W., Sigwarth, M., & Uexkuell, M. Tesos, a double fabry-perot instrument for solar spectroscopy. *Astronomy and Astrophysics*, v. 340, p. 569-578 (1998) **340**, 569 (1998).
- Korpi-Lagg, A., Gandorfer, A., Solanki, S., et al. Sunrise iii: Overview of observatory and instruments. *In preparation.* (2025).
- Kosugi, T., Matsuzaki, K., Sakao, T., et al. The hinode (solar-b) mission: An overview. *Solar Physics* **1**, 3 (2007).
- Lakshminarayanan, V., & Fleck, A. Zernike polynomials: a guide. *Journal of Modern Optics* **58**, 545 (2011).
- Lamb, D. A., Howard, T. A., DeForest, C. E., Parnell, C. E., & Welsch, B. T. Solar magnetic tracking. iv. the death of magnetic features. *The Astrophysical Journal* **774**, 127 (2013).
- Lites, B., Elmore, D., & Streander, K. The solar-b spectro-polarimeter. *Advanced solar polarimetry—theory, observation, and instrumentation*, 33 (2001).
- Lites, B. W. Rotating waveplates as polarization modulators for stokes polarimetry of the sun: evaluation of seeing-induced crosstalk errors. *Applied Optics* **26**, 3838 (1987).
- Martínez Pillet, V., Collados, M., Sánchez Almeida, J., et al. Lpsp & tip: full stokes polarimeters for the canary islands observatories. *High Resolution Solar Physics: Theory, Observations, and Techniques*, 264 (1999).
- Martinez Pillet, V., Bonet, J. A., Collados, M. V., et al. The imaging magnetograph experiment for the sunrise balloon antarctica project. *Optical, Infrared, and Millimeter Space Telescopes*, SPIE, 1152–1164 (2004).

- Martínez Pillet, V., Del Toro Iniesta, J., Álvarez-Herrero, A., et al. The imaging magnetograph experiment (imax) for the sunrise balloon-borne solar observatory. *Solar Physics* **268**, 57 (2011).
- Müller, D., Cyr, O. S., Zouganelis, I., et al. The solar orbiter mission-science overview. *Astronomy & Astrophysics* **642**, A1 (2020).
- Noda, C. Q., Ramos, A. A., Suárez, D. O., & Cobo, B. R. Spatial deconvolution of spectropolarimetric data: an application to quiet sun magnetic elements. *Astronomy & Astrophysics* **579**, A3 (2015).
- Noda, C. Q., Schlichenmaier, R., Rubio, L. B., et al. The european solar telescope. *Astronomy & Astrophysics* **666**, A21 (2022).
- Noda, C. Q., Khomenko, E., Collados, M., et al. A study of the capabilities for inferring atmospheric information from high-spatial-resolution simulations. *Astronomy & Astrophysics* **675**, A93 (2023).
- Obayashi, I., Nakamura, T., & Hiraoka, Y. Persistent homology analysis for materials research and persistent homology software: Homcloud. *Journal of the physical society of japan* **91**, 091013 (2022).
- Ormrod Morley, D., Salmon, P. S., & Wilson, M. Persistent homology in two-dimensional atomic networks. *The Journal of Chemical Physics* **154** (2021).
- Orozco Suárez, D., Katsukawa, Y., & Bellot Rubio, L. The connection between internetwork magnetic elements and supergranular flows. *The Astrophysical Journal Letters* **758**, L38 (2012).
- Orozco Suárez, D., Álvarez García, D., López Jiménez, A. C., et al. Spgcam: A specifically tailored camera for solar observations. *Frontiers in Astronomy and Space Sciences* **10**, 1167540 (2023).
- Otter, N., Porter, M. A., Tillmann, U., Grindrod, P., & Harrington, H. A. A roadmap for the computation of persistent homology. *EPJ Data Science* **6**, 1 (2017).
- Parker, E. Magnetic neutral sheets in evolving fields-part two-formation of the solar corona. *Astrophysical Journal, Vol. 264, P. 642, 1983* **264**, 642 (1983).
- Paxman, R. G., Schulz, T. J., & Fienup, J. R. Joint estimation of object and aberrations by using phase diversity. *JOSA A* **9**, 1072 (1992).
- Pesnell, W., Thompson, B., & Chamberlin, P. The solar dynamics observatory (sdo). *Solar Physics* **275** (2012).
- Petrovay, K., & Szakaly, G. The origin of intranetwork fields: a small-scale solar dynamo. *Astronomy and Astrophysics, Vol. 274, p. 543 (1993)* **274**, 543 (1993).

- Pontin, D. I., & Hornig, G. The parker problem: existence of smooth force-free fields and coronal heating. *Living Reviews in Solar Physics* **17**, 5 (2020).
- Pozuelo, S. E., Rubio, L. B., & de la Cruz Rodriguez, J. Lateral downflows in sunspot penumbral filaments and their temporal evolution. *The Astrophysical Journal* **803**, 93 (2015).
- Puschmann, K. G., Denker, C. J., Balthasar, H., et al. Gregor fabry-pérot interferometer and its companion the blue imaging solar spectrometer. *Optical Engineering* **52**, 081606 (2013).
- Rempel, M. Numerical sunspot models: robustness of photospheric velocity and magnetic field structure. *The Astrophysical Journal* **750**, 62 (2012).
- Rempel, M., Bhatia, T., Bellot Rubio, L., & Korpi-Lagg, M. J. Small-scale dynamos: from idealized models to solar and stellar applications. *Space Science Reviews* **219**, 36 (2023).
- Rimmele, T. R., Warner, M., Keil, S. L., et al. The daniel k. inouye solar telescope–observatory overview. *Solar Physics* **295**, 1 (2020).
- Ruiz Cobo, B., & del Toro Iniesta, J. Inversion of stokes profiles. *Astrophysical Journal, Part 1 (ISSN 0004-637X)*, vol. 398, no. 1, p. 375-385. **398**, 375 (1992).
- Sánchez, A., Gonzalo, A., Garranzo, D., et al. High precision and thermally controlled filter wheel. *Advances in Optical and Mechanical Technologies for Telescopes and Instrumentation V*, SPIE, 1120–1135 (2022).
- Scharmer, G. Comments on the optimization of high resolution fabry-pérot filtergraphs. *Astronomy & Astrophysics* **447**, 1111 (2006).
- Scharmer, G., Nordlund, Å., & Heinemann, T. Convection and the origin of evershed flows in sunspot penumbrae. *The Astrophysical Journal* **677**, L149 (2008).
- Scharmer, G., & Spruit, H. Magnetostatic penumbra models with field-free gaps. *Astronomy & Astrophysics* **460**, 605 (2006).
- Scharmer, G. B., de la Cruz Rodriguez, J., Süitterlin, P., & Henriques, V. M. Opposite polarity field with convective downflow and its relation to magnetic spines in a sunspot penumbra. *Astronomy & Astrophysics* **553**, A63 (2013).
- Scharmer, G. B., & Henriques, V. M. Sst/crisp observations of convective flows in a sunspot penumbra. *Astronomy & Astrophysics* **540**, A19 (2012).
- Scharmer, G. B., Narayan, G., Hillberg, T., et al. Crisp spectropolarimetric imaging of penumbral fine structure. *The Astrophysical Journal* **689**, L69 (2008).
- Scherrer, P. H., Schou, J., Bush, R., et al. The helioseismic and magnetic imager (hmi) investigation for the solar dynamics observatory (sdo). *Solar Physics* **275**, 207 (2012).

- Schlütermaier, R., Jahn, K., & Schmidt, H. Magnetic flux tubes evolving in sunspots. a model for the penumbral finestructure and the evershed effect. *arXiv preprint astroph/9807036* (1998).
- Schmidt, W., Von der Lühe, O., Volkmer, R., et al. (2012), The 1.5 meter solar telescope gregor, Wiley Online Library.
- Schmidt, W., Schubert, M., Ellwarth, M., et al. End-to-end simulations of the visible tunable filter for the daniel k. inouye solar telescope. *Ground-based and airborne instrumentation for astronomy VI*, SPIE, 1473–1483 (2016).
- Schnerr, R., de la Cruz Rodriguez, J., & van Noort, M. Stokes imaging polarimetry using image restoration: a calibration strategy for fabry-pérot based instruments. *Astronomy & Astrophysics* **534**, A45 (2011).
- Schou, J., Scherrer, P. H., Bush, R. I., et al. Design and ground calibration of the helioseismic and magnetic imager (hmi) instrument on the solar dynamics observatory (sdo). *Solar Physics* **275**, 229 (2012).
- Shibata, K., Nakamura, T., Matsumoto, T., et al. Chromospheric anemone jets as evidence of ubiquitous reconnection. *Science* **318**, 1591 (2007).
- Sitzmann, V., Martel, J. N., Bergman, A. W., Lindell, D. B., & Wetzstein, G. Implicit neural representations with periodic activation functions. *Proc. NeurIPS* (2020).
- Snyder, A. W. (1975), in Photoreceptor optics (Springer), 38–55.
- Solanki, S., & Montavon, C. Uncombed fields as the source of the broad-band circular polarization of sunspots. *Astronomy and Astrophysics, Vol. 275, p. 283* (1993) **275**, 283 (1993).
- Solanki, S., Riethmüller, T., Barthol, P., et al. The second flight of the sunrise balloon-borne solar observatory: overview of instrument updates, the flight, the data, and first results. *The Astrophysical Journal Supplement Series* **229**, 2 (2017).
- Solanki, S. K., del Toro Iniesta, J., Woch, J., et al. The polarimetric and helioseismic imager on solar orbiter. *Astronomy & Astrophysics* **642**, A11 (2020).
- Spruit, H., & Scharmer, G. Fine structure, magnetic field and heating of sunspot penumbrae. *Astronomy & Astrophysics* **447**, 343 (2006).
- Stokes, G. G. On the composition and resolution of streams of polarized light from different sources. *Transactions of the Cambridge Philosophical Society* **9**, 399 (1851).
- Sun, X., Hoeksema, J. T., Liu, Y., et al. Evolution of magnetic field and energy in a major eruptive active region based on sdo/hmi observation. *The Astrophysical Journal* **748**, 77 (2012).

- Thompson, W. Coordinate systems for solar image data. *Astronomy & Astrophysics* **449**, 791 (2006).
- Tong, C., Thompson, M., Warner, M., Rajaguru, S., & Pain, C. Acoustic wave propagation in the sun: implications for wave field and time-distance helioseismology. *The Astrophysical Journal* **582**, L121 (2002).
- Toriumi, S., Hayashi, K., & Yokoyama, T. Statistical analysis of the horizontal divergent flow in emerging solar active regions. *The Astrophysical Journal* **794**, 19 (2014).
- Toriumi, S., Iida, Y., Kusano, K., Bamba, Y., & Imada, S. Formation of a flare-productive active region: observation and numerical simulation of noaa ar 11158. *Solar Physics* **289**, 3351 (2014).
- Toriumi, S., & Wang, H. Flare-productive active regions. *Living Reviews in Solar Physics* **16**, 3 (2019).
- Tsuneta, S., Ichimoto, K., Katsukawa, Y., et al. The solar optical telescope for the hinode mission: an overview. *Solar Physics* **249**, 167 (2008).
- Tyson, R. K. (2000), Introduction to adaptive optics, Vol. 41 (SPIE press).
- Uitenbroek, H. The accuracy of the center-of-gravity method for measuring velocity and magnetic field strength in the solar photosphere. *The Astrophysical Journal* **592**, 1225 (2003).
- van Noort, M. Image restoration of solar spectra. *Astronomy & Astrophysics* **608**, A76 (2017).
- Van Noort, M., Der Voort, L. R. V., & Löfdahl, M. G. Solar image restoration by use of multi-frame blind de-convolution with multiple objects and phase diversity. *Solar Physics* **228**, 191 (2005).
- Van Noort, M., & van der Voort, L. R. Stokes imaging polarimetry using image restoration at the swedish 1-m solar telescope. *Astronomy & Astrophysics* **489**, 429 (2008).
- Vargas Dominguez, S. Study of horizontal flows in solar active regions based on high-resolution image reconstruction techniques. *Ph. D. Thesis* (2009).
- Vögler, A., Shelyag, S., Schüssler, M., et al. Simulations of magneto-convection in the solar photosphere-equations, methods, and results of the muram code. *Astronomy & Astrophysics* **429**, 335 (2005).
- Wedemeyer-Böhm, S., Scullion, E., Steiner, O., et al. Magnetic tornadoes as energy channels into the solar corona. *Nature* **486**, 505 (2012).
- Welsch, B., & Longcope, D. Magnetic helicity injection by horizontal flows in the quiet sun. i. mutual-helicity flux. *The Astrophysical Journal* **588**, 620 (2003).

- Zernike, F. Diffraction theory of the knife-edge test and its improved form, the phase-contrast method. *Monthly Notices of the Royal Astronomical Society*, Vol. 94, p. 377-384 **94**, 377 (1934).
- Zwaan, C. Elements and patterns in the solar magnetic field. IN: *Annual review of astronomy and astrophysics. Volume 25 (A88-13240 03-90)*. Palo Alto, CA, Annual Reviews, Inc., 1987, p. 83-111. **25**, 83 (1987).