

# **A Fractal Analysis of Magnetograms Within Active Regions**

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Received: 12 July 2019 / Accepted: 27 December 2019 / Published online: 15 January 2020 © Springer Nature B.V. 2020

**Abstract** The magnetograms of 16 active regions, observed during June–November 2015, were obtained from the *Joint Science Operations Center* (JSOC) from the *Solar Dynamics Observatory* (SDO) using the *Helioseismic and Magnetic Imager* (HMI) and used to determine the fractal dimensions of various magnetic field groups. The fields were divided into strong (positive and negative) and weak (positive and negative) groupings. The areaperimeter method was used to determine the fractal dimensions for the umbral and penumbral regions of the magnetograms. The fractal dimensions were found to be  $1.79 \pm 0.49$  and 1*.*96 ± 0*.*29 for strong and weak magnetic fields, respectively. When compared to the umbral and penumbral fractal dimensions determined by Rajkumar, Haque and Hrudey (*Sol. Phys.* **292**, 170, [2017\)](#page-11-0) using white light images, an inverse relationship was found, with the umbra showing lower fractal dimensions than the penumbra for the magnetic field groups compared to the intensity images. This directly implies that there is greater complexity in the penumbral magnetic field groupings than the umbral region. This has implications for models that constrain how the magnetic field groups are contained in the cooler umbral regions.

**Keywords** Active regions · Magnetic fields · Magnetograms · Fractals · Fractal dimensions

## **1. Introduction**

Fractals, popularized by Mandelbrot ([1983\)](#page-10-0), have long been used to understand the apparent chaotic behavior of nature by quantifying its complexity, where Euclidean geometry is not easily suitable (Voss, [1988\)](#page-11-1). They refer to a special type of geometry that describes

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complex and self-similar phenomena which are abundant in nature and demonstrate nonlinearity. Self-similarity refers to the invariance under different scales and gives rise to the measure of the fractal dimension (Bunde and Havlin, [2013\)](#page-10-1). From large-scale fractal structures in laboratory turbulence, the ocean and clustering of galaxies (Bershadskii, [1990\)](#page-10-2) to the mechanisms behind tumor growth (Baish and Jain, [2000\)](#page-10-3), fractals serve as a useful tool in understanding complex phenomena. The complexity of these phenomena can be expressed as a real, non-integer number which is referred to as the fractal dimension or Hausdorff-Besicovitch dimension (Mandelbrot, [1983](#page-10-0)). In Euclidean geometry, a point has a dimension of zero, a line a dimension of one, and a plane a dimension of two, while a dimension of three refers to a cube in space. For a figure on a plane, if the fractal dimension is less than 2, we have fractal structures which are scale-free, demonstrating incomplete filling of the figure under examination. The greater the difference of the fractal dimension from its Euclidean value of two, this indicates that the finer the structure is exhibited. If the fractal dimension is less than one in a two-dimensional fractal scenario, the structures are considered to demonstrate a scale-free hierarchy and this is known as fractal dust (Georgoulis, [2012;](#page-10-4) Schroeder, [2009\)](#page-11-2). It therefore can be seen that the fractal dimension is a good indicator of complexity and a measure of departure from the Euclidean geometry as is frequently encountered in nature.

Given the suitability of fractals in describing many non-linear geometry in nature, it is therefore a useful tool in its application to the geometry of sunspots and active regions (Deng, [2016](#page-10-5); Golovko and Salakhutdinova, [2012\)](#page-10-6). The size distribution of active regions has been shown to demonstrate a power law which implies fractal structures (Harvey and Zwaan, [1993](#page-10-7)).

Many features observed on the Sun are driven by solar magnetic fields (Hathaway and Upton, [2014\)](#page-10-8). Faculae, prominences, coronal mass ejections, solar flares, and sunspots are all due to the magnetic fields on the Sun. Sunspots belong to the more prominent surface features associated with the solar magnetic field since it is the most important quantity when determining the properties of sunspots (Solanki, [2003\)](#page-11-3). Georgoulis [\(2012](#page-10-4)) notes that fractals are excellent tools to understand the origin and nature of solar magnetism.

Sunspots are dark features on the Sun's surface caused by the hindrance of upward convective flow due to the emergence of magnetic flux tubes through the photosphere. They are usually characterized by a dark central region called an umbra surrounded by a lighter feature called a penumbra. Smaller regions which contain an umbra without a penumbra are called pores. Sunspots grow and decay depending on the amount of magnetic flux rising through the surface. They can coalesce or break apart and last from a few hours to several days. All sunspots and pores are found within active regions (ARs). ARs refer to the area influenced by solar magnetic fields and are formed similarly to sunspots. They are usually bipolar and may contain single or multiple sunspots, pores, and in some cases a combination of both (Solanki, [2003\)](#page-11-3). While sunspots can be seen in white light images, special magnetogram images mapping the magnetic field strengths are needed to see ARs.

This complex and dynamic behavior of sunspots, and by extension ARs, make them the ideal phenomenon for fractal analysis. Fractal dimensions have been used extensively to understand the behavior of sunspots and ARs. Zelenyi and Milovanov ([1991\)](#page-11-4) proposed a fractal model of sunspots where fractal clusters were formed from the collection of magnetic force tubes while Chumak and Chumak [\(1996](#page-10-9)) determined that the fractal dimension for sunspot umbrae corresponded to turbulent structures which correspond to elastic skeletons. Rajkumar, Haque, and Hrudey ([2017\)](#page-11-0) also determined the fractal dimensions for sunspot umbrae along with the penumbrae as  $2.09 \pm 0.42$  and  $1.72 \pm 0.40$ , respectively. They suggested that the compressible flow may be linked to the morphology of sunspots. They also observed a positive correlation between the umbral and penumbral fractal dimensions which suggests that changes in complexity between the features may be linked.

Fractals have also been used to analyze magnetograms to understand the complexity and model the behavior of solar magnetic fields and other solar phenomena. Meunier [\(1999](#page-11-5)) performed a fractal analysis to determine the fractal dimensions of ARs where it was determined that the fractal dimensions vary with magnetic threshold and that structures of moderate sizes are more complex at lower magnetic thresholds whereas large structures exhibit less complexity. Abramenko [\(2005\)](#page-10-10) studied magnetograms and found that multi-fractality is a good indicator of flaring ARs in contrast to the determination by Georgoulis [\(2012](#page-10-4)) who concluded that while fractals and multi-fractals were useful tools for understanding the solar magnetism, they were not suitable in predicting major solar flares in ARs. It was noted that an increase in multi-fractality is a signal that a magnetic structure is being driven to a critical state. The multi-fractal nature of active region magnetic fields was also confirmed by Chumak [\(2005\)](#page-10-11). By analyzing the fractal dimensions for a solar X-ray flux time series, Chumak [\(2005](#page-10-11)) was able to observe great variations in the fractal dimensions, even for two consecutive days which the author concluded that fractal dimensions can be used as a good X-ray index.

A study on the fractal dimensions of ARs using magnetograms conducted by Ioshpa *et al.* ([2005\)](#page-10-12) indicated the existence of turbulent currents at the umbra-penumbra and penumbraphotosphere boundaries. Ioshpa, Obridko, and Rudenchik [\(2008\)](#page-10-13) later showed that the magnetic field distribution is more regular in ARs.

<span id="page-2-0"></span>Our study focuses on the comparison of active region structures (umbra and penumbra) to active region magnetic fields using fractal dimensions. In Section [2,](#page-2-0) the data set used is described with emphasis on how the images were prepared and measured. In Section [3](#page-6-0), the results and analysis of the data are reported. In Section [4,](#page-7-0) we discuss our findings followed by the conclusion in Section [5](#page-9-0).

#### **2. Method**

Our study is divided into two main sections. In the first section the magnetic fields of the magnetograms are separated into various magnetic field groups based on their magnetic field strength and polarity. The fractal dimension of each field magnetic field group is determined. In the second section, flattened intensity images are used to determine the outline of the umbra and penumbra. The umbra and penumbra outlines are then overlaid unto the magnetograms to determine which magnetic field groups are present within the umbral and penumbral regions of ARs.

The data set used in this study is the same data set used by Rajkumar, Haque, and Hrudey ([2017\)](#page-11-0) which contains 16 ARs observed between 16th June 2015 and 3rd November 2015. The 4k *Helioseismic and Magnetic Imager* (HMI) full disk Magnetograms and 4k HMI full disk Flattened Intensity images which correspond to the data set were obtained from the *Joint Science Operations Center* (JSOC) HMI Archive. We show one typical example of the data treatment for our sample of 16 ARs, for AR 12367 on 16th June 2015 as seen in Figures [1](#page-3-0) and [2.](#page-3-1) The ARs used by Rajkumar, Haque, and Hrudey [\(2017](#page-11-0)) were then isolated and cropped from both magnetogram and flattened intensity full disk images as seen in Figures [1](#page-3-0) and [2](#page-3-1), respectively.

The HMI Magnetic Field Color Table (Hoeksema, [2014](#page-10-14)) which assigns the following magnetic thresholds was used to separate the magnetic fields of the ARs into four main threshold groups, hereafter referred to magnetic field groups:

a)

<span id="page-3-0"></span>

 $$ 

**Figure 1 a**) Flattened intensity full disk image and **b**) flattened intensity cropped image containing AR 12367 on 16th June 2015.

<span id="page-3-1"></span>

**Figure 2 a**) Color magnetogram full disk image and **b**) color magnetogram cropped image containing AR 12367 on 16th June 2015.

- i) Weak positive fields  $(24 \text{ to } 236 \text{ G})$  green.
- ii) Weak negative fields  $(-236 \text{ to } -24 \text{ G})$  yellow/orange.
- iii) Strong positive fields  $(237 \text{ to } 1500 \text{ G}) \text{blue}$ .
- iv) Strong negative fields  $(-1500 \text{ to } -237 \text{ G})$  red.

Strong and weak fields independent of polarity were also considered and separated as follows:

- i) Weak fields  $(-236$  to  $-24$  G) and 24 to 236 G) yellow/orange and green.
- ii) Strong fields  $(-1500$  to  $-237$  G and 237 to 1500 G) red and blue.

The analysis requires the determination of areas and perimeters of the umbral and penumbral regions of the magnetograms. This was done by use of the tool ImageJ. This is a Java-based image processing program developed at the National Institutes of Health and the Laboratory for Optical and Computational Instrumentation. It is an open source image processing program designed for scientific multidimensional images which allows the determination of sizes, perimeters and areas of complicated structures. It is very useful and suitable to determine the perimeters and areas for sunspots and ARs as for this study.

 $a)$ 



<span id="page-4-0"></span>**Figure 3a** Cropped color magnetogram of AR 12367 on 16th June 2015 with selected strong positive magnetic fields outlined in *black*.

<span id="page-4-1"></span>

**Figure 3b** Cropped color magnetogram of AR 12367 on 16th June 2015 with selected weak negative fields outlined in *black*.

The color threshold tool of ImageJ was used to outline each magnetic field group as seen in the example shown in Figures  $3a$  and  $3b$ . The measure tool was then used to determine the areas and perimeters of each magnetic field group. Areas are reported in squared pixels while the perimeters are reported in pixels. These measurements are used to determine the fractal dimensions of each magnetic field group.

The fractal dimensions were determined using the same area-perimeter relation utilized by Chumak and Chumak [\(1996](#page-10-9)), McAteer, Gallagher, and Ireland ([2005\)](#page-10-15), Meunier ([1999\)](#page-11-5)), Rajkumar, Haque, and Hrudey [\(2017](#page-11-0)). This method is also recommended by Takayasu ([1990\)](#page-11-6) and Feder [\(2013](#page-10-16)) as it is very useful because of its sensitivity to the complexity of structures (Meunier, [1999\)](#page-11-5).

<span id="page-5-0"></span>

**Figure 4** Images showing magnetic fields contained within the outline of **a**) sunspot umbra and **b**) sunspot penumbra of AR 12367 observed on 16th June 2015.

The area of the magnetic field group, *S*, is related to the perimeter of the magnetic field group, *L*, by

$$
S \approx L^q.
$$

Therefore,

$$
q = \frac{\log S}{\log L},
$$

where *q* is related to the fractal dimension, *d*, by

$$
d = \frac{2}{q}.
$$

If the structure of the magnetic field groups were uniform or circular *d* would be close to 1, however, as the structure of the magnetic fields become more complex and less uniform, *d* approaches 2 (Mandelbrot, [1983](#page-10-0)) As such, the fractal dimension, *d*, can be regarded as synonymous with complexity as noted by Meunier [\(1999](#page-11-5)) in the study of the fractal analysis of *Michelson Doppler Imager* (MDI) magnetograms.

The flattened intensity images of the ARs used in the previous study (Rajkumar, Haque, and Hrudey, [2017](#page-11-0)) were then overlaid onto the corresponding color magnetogram. The outline of the umbral and penumbral regions observed in the flattened intensity images were traced on to the corresponding color magnetograms. The regions on the magnetograms outlined by the umbra and penumbra of each active region were then extracted from the corresponding magnetograms (as seen in Figure [4\)](#page-5-0). This allows for the determination of the magnetic fields within the umbral and penumbral regions of these ARs.

It should be noted that, since the penumbra outline is used to determine the penumbral region, the areas and magnetic fields enclosed by the penumbra outline are considered as part of the penumbral region.

The area of each AR's umbra and penumbra was then measured using ImageJ's threshold and measure tools. The areas of each magnetic field group contained within the outline of the umbra and penumbra regions were also measured (Figure  $5$ ). The areas of each magnetic field group were then compared to the areas of the umbra and penumbra separately to determine how the magnetic field groups were distributed within the umbral and penumbral regions.

<span id="page-6-1"></span><span id="page-6-0"></span>**Figure 5** Image showing magnetic fields contained within the outline of the penumbra of AR 12367 on 16th June 2015 with selected weak positive fields outlined in *black*.



### **3. Results and Analysis**

Figures [1](#page-3-0) and [2](#page-3-1) show a typical example of how the data was analyzed for the 16 ARs and their corresponding magnetograms. The ARs of interest were cropped from their respective HMI flattened intensity images and HMI color magnetogram images. It was ensured that cropped sections were of the same dimensions and of the exact same location to ensure accuracy in the overlay. It should also be noted that the ARs selected by Rajkumar, Haque, and Hrudey [\(2017](#page-11-0)) were located near the center of the solar disk to avoid distortions caused by the Wilson effect (Loughhead and Bray, [1958](#page-10-17)) where the foreshortening is negligible.

Figures [3a](#page-4-0) and [3b](#page-4-1) show examples of how the magnetic field groups were outlined. These field groups were taken from the HMI Magnetic Field Color Table (Hoeksema, [2014\)](#page-10-14) obtained from the JSOC. These outlines are analogous to the magnetic field thresholds used by Jurčák *et al.* [\(2018](#page-10-18)) and Meunier ([1999\)](#page-11-5), as well as the magnetic field contours used by Ioshpa *et al.* [\(2005](#page-10-12)) and Régnier and Canfield [\(2006](#page-11-7)). By using the color magnetograms and the magnetic field groups outlined in the method, the magnetic fields can be compared by strength and polarity to their corresponding umbral and penumbral structures. From these outlines, the area and perimeter of the magnetic fields can be determined. Figure [6](#page-7-1) shows the plots of log area *S* against log perimeter *L*. The error bars included in Figure [6](#page-7-1) repre-sents the standard error from the regression analysis. From Figure [6](#page-7-1), Table [1](#page-8-0) summarizes the values of *q* and the fractal dimension *d* for the various magnetic field thresholds. The errors reported in Table [1](#page-8-0) are at the 95% confidence level.

From Table [1](#page-8-0), it is seen that the fractal dimensions for positive weak  $(1.77 \pm 0.20)$ and positive strong  $(1.57 \pm 0.37)$  fields are lower than the fractal dimensions for negative weak (1.83  $\pm$  0.25) and negative strong (1.67  $\pm$  0.42) fields, respectively. Since higher fractal dimension indicate greater geometric complexity, this means that our analysis shows that negative fields create more complex structures than positive fields. It is also noted that the fractal dimensions for positive weak, negative weak and weak (1.96  $\pm$  0.29) fields are higher than the corresponding positive strong, negative strong and strong (1.79  $\pm$  0.49) fields. In both cases, the strong fields have lower fractal dimensions independent of whether it is positive or negative field strength. This indicates that a relationship between weak and strong magnetic fields exists where weak fields produce more complex structures.

Figures [4a](#page-5-0) and [4b](#page-5-0) show examples of the magnetic fields present within the umbra and penumbra, respectively. This is achieved by overlaying the HMI flattened intensity images over the HMI color magnetograms and extracting the magnetic fields which are encompassed by the outlines of the umbra and penumbra. This was done for each active region in the data set used. When comparing the areas of each magnetic field group to the areas of the umbra and penumbra, it was noted that none of the umbral regions contained any weak magnetic fields, however, it was possible for the umbral regions to contain only positive or only negative magnetic fields. This is evident in Figure [4](#page-5-0)a. It was also observed that penumbral



<span id="page-7-1"></span>**Figure 6** Determination of the fractal dimension, *d*, for various magnetic field thresholds from the plots of log area *S* and log perimeter *L*.

<span id="page-7-0"></span>regions contained a mixture of both strong and weak magnetic fields. While umbral regions could also contain only positive or only negative magnetic fields, the magnetic fields would be a mixture of weak and strong positive fields or weak and strong negative fields. This can also be seen in Figure [4](#page-5-0)b.

#### **4. Discussion**

By measuring the areas of the various magnetic thresholds contained in both the umbra and the penumbra, it was determined that strong magnetic fields dominate the ARs, as expected, since magnetic fields are the driving force behind active region formation (Solanki, [2003](#page-11-3)).

<span id="page-8-0"></span>

It was observed that umbral regions contain only strong magnetic fields while penumbral regions contain both. According to Jurčák *et al.* [\(2018](#page-10-18)), stronger and more vertical magnetic fields are found within the umbra than within the penumbra. It is noted that the magnetic field strength decreases and becomes more horizontal with distance from the umbral core (Jurčák *et al.*, [2018\)](#page-10-18). This suggests that while strong magnetic fields dominate the penumbra, the presence of weaker magnetic fields in the penumbra can account for differences in structure and behavior between the two regions. This would also account for the turbulence noted by Ioshpa *et al.* [\(2005\)](#page-10-12). This can be understood by our finding of the respective fractal dimensions.

Rajkumar, Haque, and Hrudey [\(2017](#page-11-0)), determined the fractal dimensions of 2.09 and 1.72, respectively, for the umbra and penumbra from the 16 ARs studied on the photosphere. Since the umbra has a higher fractal dimension than that of the penumbra, this indicated that the complexity of the structure within the umbra is higher than that of the penumbra. Rajkumar, Haque, and Hrudey [\(2017](#page-11-0)) found that Weitz *et al.* ([1985](#page-11-8)) study on gold colloids yielded similar fractal dimensions, which were driven by diffusion-limited and reactionlimited kinetics caused by ionization of the colloid, and that made an interesting analogy for the formation of umbrae and penumbrae in the ARs on the photosphere.

They proposed that this gold colloid analysis may be used as an analog model for Jaeggli ([2011\)](#page-10-19) model of sunspot formation where it is proposed that sunspots being cooler regions on the surface of the Sun, allow for molecular hydrogen to exist in the umbra compared with ionized hydrogen in the penumbral regions with elevated temperatures. Jaeggli, Lin, and Uitenbroek ([2012](#page-10-20)) suggest that the formation of molecules provides a mechanism for isothermal concentration of the umbral magnetic field, and that this may explain the observed rapid increase in umbral magnetic field strength relative to temperature. This is consistent with our finding from our sample, of the magnetic field strengths in the umbra, where strong magnetic fields dominate this region exclusively, whereas there is mixed field strengths in the penumbral region.

Among other studies which determine the fractal dimension of magnetograms, we note that Meunier [\(1999](#page-11-5)) used the perimeter/area relation as employed in this study and found that the fractal dimension increased with the area of the ARs ranging from 1.48 to 1.68. Georgoulis [\(2012](#page-10-4)) determined the scale-free fractal dimension for magnetograms in ARs using the box counting method, and found it to range between 1.2 to 1.6. This is somewhat lower than the values we determined for the strong and weak magnetic fields. However, a major departure in our study is the inclusion of umbral and penumbral fractal dimension with giving consideration to strong and weak magnetic fields. This can explain the discrepancy in our values determined compared to the values noted. Our study shows that the fractal dimension for strong magnetic fields  $1.79 \pm 0.49$  is lower than that of weak magnetic fields  $1.96 \pm 0.29$ . This indicates that the structures associated with weak magnetic fields are more complex than those of strong magnetic fields. The same trend is evident if we consider the

average fractal dimension for weak and strong fields, without considering the polarity of the magnetism. The average fractal dimension for weak magnetic fields is 1.85 with the average value of the strong magnetic field being 1.68 from our studies. As suggested earlier, while strong magnetic fields dominated both umbral and penumbral regions, the presence of weak magnetic fields within penumbral regions may account for differences in the structure and behavior between the two regions. Considering the penumbral regions to be represented by the weak magnetic fields, the comparison shows an inverse complexity relationship between the structure of magnetic fields and the structure of the physical features they produce. The turbulence noted by Ioshpa *et al.* ([2005\)](#page-10-12) at the interface of the umbra and penumbra could be responsible for the greater complexity in the magnetogram in the penumbra as determined by our study.

Some of the earlier determinations of the fractal dimensions with magnetic thresholds yield mixed results. Ruzmaikin, Sokoloff, and Tarbell ([1991\)](#page-11-9) found the fractal dimension decreasing from 1.71 to 1.49 between 200 and 800 G. Between 12 and 48 G, the variation went from 1.42 to 1.19. Balke *et al.* [\(1993](#page-10-21)) obtained an average fractal dimension of 1.54 for the magnetic threshold between 200 and 900 G. Another study by Nesme-Ribes, Meunier, and Collin ([1996\)](#page-11-10) found the fractal dimension for 1000 faculae in ARs to vary between 1.60 and 1.72 based on the method utilized. Meunier ([1999\)](#page-11-5) notes that these discrepancies may be explained by different samples and spatial resolutions which will be applicable to our study as well.

Our study further supports Jaeggli [\(2011](#page-10-19)) and Jaeggli, Lin, and Uitenbroek ([2012\)](#page-10-20) model which shows that molecular hydrogen formed within the cooler central regions of the umbra become ionized due to the increase in temperature as they move towards the umbrapenumbra boundary. The increase in ionized hydrogen near the boundary creates a high outer pressure which traps strong magnetic fields within the central region, preventing the active region from decaying more rapidly (Jaeggli, [2011\)](#page-10-19). The survey and analysis reported in Jaeggli, Lin, and Uitenbroek [\(2012](#page-10-20)) provide observational evidence that significant  $H_2$ molecule formation is present in sunspots that are able to maintain maximum fields greater than 2500 G. Due to the entrapment of the magnetic fields, we suggest that the structure in the magnetogram umbra will be tighter bound and enclosed, which will allow for less complexity in geometrical structure as we have found.

<span id="page-9-0"></span>The lower fractal dimension for strong magnetic fields within the umbra corresponds to the trapped magnetic fields explained by Jaeggli [\(2011](#page-10-19)) and Jaeggli, Lin, and Uitenbroek ([2012\)](#page-10-20). The reduced freedom of motion leads to a less complex magnetic structure while the higher fractal dimension for weak magnetic fields, within the penumbra, can be attributed to the unbound magnetic fields within that region and turbulence therein, literally causing leakage, loose structure formation and therefore generating greater complexity. It is very interesting that the model discussed matches the totally independent geometrical measure found in our study.

### **5. Conclusion**

The fractal dimension of strong magnetic fields was found to be  $1.79 \pm 0.49$  while weak magnetic fields had a higher fractal dimension of  $1.96 \pm 0.29$  consistent in trend with the average fractal dimension values 1.85 and 1.68, respectively. It was also determined that the umbra contained only strong magnetic fields while the penumbra contained both strong and weak fields. It is suggested that the presence of weak fields in the penumbra account for the variation of structure between the umbra and penumbra and the increase in complexity thereby in the penumbral regions. When compared to the fractal dimensions of the umbra and penumbra of the flattened intensity ARs determined by Rajkumar, Haque, and Hrudey ([2017\)](#page-11-0), an inverse complexity relationship was found, where the less complex structure of the strong magnetic fields contribute to the more complex physical structure of the umbra, while the less complex structure of the penumbra is associated with the more complex structure of weak magnetic fields. This inverse complexity relationship also supports the Jaeggli ([2011\)](#page-10-19) and Jaeggli, Lin, and Uitenbroek ([2012\)](#page-10-20) model of sunspot formation.

**Acknowledgment** The authors thank the referees whose comments were very valuable in improving the manuscript.

<span id="page-10-10"></span><span id="page-10-3"></span>**Disclosure of Potential Conflicts of Interest** The authors declare they have no conflicts of interest.

<span id="page-10-21"></span><span id="page-10-2"></span>**Publisher's Note** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

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