

# Are Solar Active Regions with Major Flares More Fractal, Multifractal, or Turbulent Than Others?

Manolis K. Georgoulis

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**Abstract** Multiple recent investigations of solar magnetic-field measurements have raised claims that the scale-free (fractal) or multiscale (multifractal) parameters inferred from the studied magnetograms may help assess the eruptive potential of solar active regions, or may even help predict major flaring activity stemming from these regions. We investigate these claims here, by testing three widely used scale-free and multiscale parameters, namely, the fractal dimension, the multifractal structure function and its inertial-range exponent, and the turbulent power spectrum and its power-law index, on a comprehensive data set of 370 timeseries of active-region magnetograms (17 733 magnetograms in total) observed by SOHO's *Michelson Doppler Imager* (MDI) over the entire Solar Cycle 23. We find that both flaring and non-flaring active regions exhibit significant fractality, multifractality, and non-Kolmogorov turbulence but none of the three tested parameters manages to distinguish active regions with major flares from flare-quiet ones. We also find that the multiscale parameters, but not the scale-free fractal dimension, depend sensitively on the spatial resolution and perhaps the observational characteristics of the studied magnetograms. Extending previous works, we attribute the flare-forecasting inability of fractal and multifractal parameters to *i*) a widespread multiscale complexity caused by a possible underlying self-organization in turbulent solar magnetic structures, flaring and non-flaring alike, and *ii*) a lack of correlation between the fractal properties of the photosphere and overlying layers, where solar eruptions occur. However useful for understanding solar magnetism, therefore, scale-free and multiscale measures may not be optimal tools for active-region characterization in terms of eruptive ability or, ultimately, for major solar-flare prediction.

**Keywords** Active regions, magnetic fields · Flares, forecasting · Flares, relation to magnetic field · Magnetic fields, photosphere · Turbulence

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Solar Image Processing and Analysis  
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M.K. Georgoulis (✉)

Research Center for Astronomy and Applied Mathematics (RCAAM), Academy of Athens, 4 Soranou Efessiou Street, Athens 11527, Greece  
e-mail: [manolis.georgoulis@academyofathens.gr](mailto:manolis.georgoulis@academyofathens.gr)

## 1. Introduction

The ever-increasing remote-sensing capabilities of modern solar magnetographs have led to the undisputed conclusion that solar (active region in particular) magnetic fields exhibit an intrinsic complexity. “Complexity” is a term commonly used to describe an array of properties with one underlying characteristic: a scale-invariant, self-similar (fractal) or multiscale (multifractal) behavior. The measured photospheric magnetic fields in active regions are indeed *multifractal* (see, e.g., Lawrence, Ruzmaikin, and Cadavid, 1993; Abramenko, 2005), that is, consisting of a number of fractal subsets. As such, they are also *fractal*, with a fractal dimension equal to the maximum fractal dimension of the ensemble of fractal subsets.

Fractality is a mathematical property but with important physical implications. Scale-free or multiscale manifestations are thought to stem from an underlying self-organized, or self-organized critical (SOC), evolution in active regions. Self-organization refers to the internal, intrinsic reduction of the various parameters (also called degrees of freedom) of a nonlinear dynamical system, such as a solar active region, into a small number of *important* parameters that govern the system’s evolution and, perhaps, its dynamical response (Nicolis and Prigogine, 1989). Assumptions on the nature of just these important parameters can lead to models of active-region emergence and evolution encapsulated in simplified *cellular automata* models (Wentzel and Seiden, 1992; Seiden and Wentzel, 1996; Vlahos *et al.*, 2002; Fragos, Rantsiou, and Vlahos, 2004). Self-organized criticality, on the other hand, implies that the self-organized system evolves through a sequence of metastable states into a state of *marginal* stability with respect to a critical threshold. Local excess of the threshold gives rise to spontaneous, intermittent instabilities lacking a characteristic size (Bak, Tang, and Wiesenfeld, 1987; Bak, 1996).

The intrinsic self-organization in solar active regions may be attributed to the *turbulence* dominating the emergence and evolution of solar magnetic fields. Tangled, fibril magnetic fields rising from the convection zone can be explained via Kolmogorov’s theory of fluid turbulence (see, e.g., Brandenburg *et al.*, 1990; Longcope, Fisher, and Pevtsov, 1998; Cattaneo, Emonet, and Weiss, 2003). Turbulence in the generation and ascension of solar magnetic fields leads to turbulent photospheric flows (see, e.g., Hurlburt, Brummel, and Toomre, 1995). Thus, the turbulent photosphere is viewed as a driver that gradually but constantly perturbs an emerged magnetic-flux system, such as an active region, dictating self-organization in it and possibly forcing it toward a marginally stable, SOC state (see, e.g., Vlahos and Georgoulis, 2004). Turbulent action does not cease in the photosphere, but it extends into the solar corona. However, coronal low- $\beta$  turbulence may not be the Kolmogorov fluid turbulence applying to the high- $\beta$  plasma of the convection zone and the photosphere. Instead, it might be an intermittent magnetohydrodynamic (MHD) turbulence (Kraichnan, 1965; Biskamp and Welter, 1989).

Fractal, multifractal, and turbulent properties of photospheric active-region magnetic fields have been intensely studied in recent years. Fractality is traditionally investigated via the *fractal dimension*, often inferred using box-counting techniques (see, e.g., Mandelbrot, 1983). Box counting is also used for multifractal studies in space and time (see, e.g., Evertsz and Mandelbrot, 1992), involving also *generalized correlation dimensions* (Georgoulis, Kluiving, and Vlahos, 1995; Kluiving and Pasmanter, 1996). A commonly used multifractal method that does not require box counting is the calculation of the *multifractal structure-function spectrum* (Frisch, 1995). Moreover, a practical method for quantifying turbulence is the calculation of the turbulent *power spectrum*, stemming from the original work of Kolmogorov (1941). If the power spectrum shows a power law over a range of scales, perceived as the turbulent inertial range, its slope determines whether the inferred

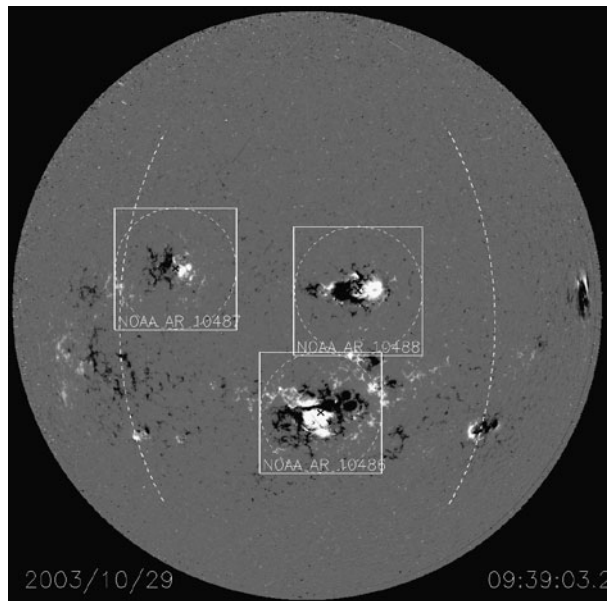
turbulence is Kolmogorov-like (scaling index  $\approx -5/3$ ) or Kraichnan-like (scaling index  $\approx -3/2$ ) if either of these two applies.

Multiple studies on fractality, multifractality, and turbulence in photospheric active-region magnetic fields have raised claims that flaring active regions exhibit distinct, distinguishable complexity. These works might lead to the impression that fractal, multifractal, or turbulent measures hold significant flare-predictive capability or, at least, they might be used to identify flaring active regions before they actually flare. To summarize some of these works, Abramenko *et al.* (2003) suggested that a “peak in the correlation length might be a trace of an avalanche of coronal reconnection events”. McAteer, Gallagher, and Ireland (2005) reported that “solar flare productivity exhibits an increase in both the frequency and GOES X-ray magnitude of flares from [active] regions with higher fractal dimension”. Further, Abramenko (2005) found that “the magnitude of the power index at the stage of emergence of an active region ... reflects its future flare productivity when the magnetic configuration becomes well evolved”, while Georgoulis (2005) reported that “the temporal evolution of the [inertial-range] scaling exponents in flaring active regions probably shows a distinct behavior a few hours prior to a flare”. More recently, Conlon *et al.* (2008) worked on a sample of four active regions and reported evidence for a “direct relationship between the multifractal properties of the flaring regions and their flaring rate”, while Hewett *et al.* (2008), reporting on “preliminary evidence of an inverse cascade in active region NOAA 10488” found a “potential relationship between energy [power-spectrum] scaling and flare productivity”. Many of these works are also reviewed by McAteer, Gallagher, and Conlon (2010).

If the above findings are independently confirmed, they may well lead to notable improvements in our physical understanding of active regions and in highlighting possible differences between flaring (that is, hosting major flares) and non-flaring (that is, hosting only sub-flares) regions. In Georgoulis (2005) we studied three different scale-free and multiscale parameters, namely, the fractal dimension, the spectrum of generalized correlation dimensions, and the structure-function spectrum and its inertial-range exponents over a limited magnetogram sample of six active regions, three of them hosting at least one major flare (M- or X-class in the GOES X-ray 1–8 Å flare classification scheme). In one case of a X-flaring active region – NOAA active region (AR) 10030 with an X3 flare at the time of the observations – we noticed a sharp preflare increase of the inertial-range exponent of the structure functions followed by a significant ( $\approx 20\%$  and much above uncertainties), permanent decrease after the flare. We suggested that this analysis should be repeated on a much larger sample of *both* flaring and non-flaring regions to determine whether this behavior was incidental.

In this study we analyze a comprehensive sample of 370 timeseries of active-region magnetograms. In this sample, 77 active regions hosted at least one M- or X-class flare during the observations and they are considered *flaring* (17 X-class flaring, 60 M-class flaring), while the remaining 293 active regions were not linked to major flares and are hence considered *non-flaring*. We calculate three of the most promising scale-free and multiscale measures on this data set, namely, the fractal dimension, the multifractal structure-function spectrum, and the turbulent power spectrum. A detailed description of the data and techniques follows in Section 2. In Section 3 we test the sensitivity of the calculated parameter values on the spatial resolution of the studied magnetogram. A statistical analysis of the active-region sample is performed in Section 4, while Section 5 summarizes the study, discusses the results, and outlines our conclusions.

**Figure 1** Pictorial output of our active-region identification algorithm (ARIA), applied to a full-disk SOHO/MDI magnetogram acquired on 29 October 2003. A  $60^\circ$  meridional zone centered on the central meridian is indicated by the thick dashed brackets. Three active regions fulfilled our selection criteria, namely, NOAA ARs 10486, 10487, and 10488. The portion of the disk found to include each region is shown by the thin dashed circles – the actual portion extracted for each region is shown by the circumscribed squares. The NOAA labels for each region are provided automatically. The flux-weighted centroids for each active region are represented by black crosses.

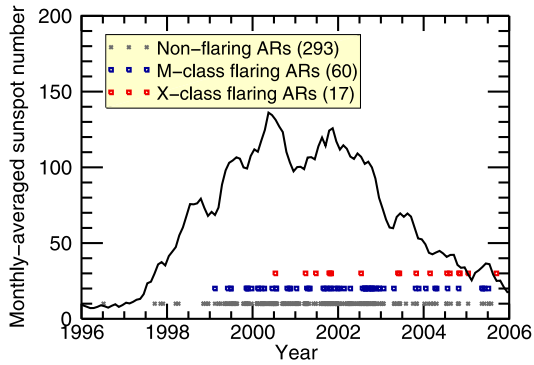


## 2. Design of the Study

### 2.1. Magnetogram Data

Our active-region sample has been constructed using data from the *Michelson Doppler Imager* (MDI; Scherrer *et al.*, 1995), onboard the *Solar and Heliospheric Observatory* (SOHO) mission. We acquired the entire MDI magnetogram archive from mid-1996 to late-2005. The archive consists of full-disk line-of-sight solar magnetograms taken at a 96-minute cadence with a linear pixel size of  $\approx 1.98$  arcsec (a mean  $\approx 1440$  km at solar disk center, depending on Sun–Earth distance). This analysis uses purely line-of-sight, Level 1.5 SOHO/MDI magnetic-field measurements that are known (Berger and Lites, 2003) to underestimate sunspot and plage fields (more recent, Level 1.8.2 sensitivity corrections to the MDI full-disk magnetograms are not used in this study because our full-disk magnetogram dataset was constructed in 2007 and the recalibrated magnetograms were posted in December 2008). Nonetheless, we have avoided applying any additional corrections to the data to avoid a possible impact on the morphological characteristics of the regions studied, since fractal and multifractal analysis highlights exactly these characteristics. To reduce the impact of projection effects acting on the magnetic-field vector, we restrict our study to a  $60^\circ$  longitudinal region centered on the central solar meridian. Use of this zone introduces a systematic underestimation in the normal magnetic-field component by a factor up to  $\approx (1 - \cos(\theta)) \approx 0.14$ , or 14%, at the Equator, for a central meridian distance  $\theta = 30^\circ$  approximated by the angular difference between the local normal and the line of sight for an observer at Earth. Conventionally, this underestimation factor is deemed tolerable when the line-of-sight field component is used as a proxy of the normal field component. Within this  $60^\circ$  meridional zone we identified and extracted active regions using our automatic active-region identification algorithm (ARIA), detailed by LaBonte, Georgoulis, and Rust (2007) and by Georgoulis, Raouafi, and Henney (2008). Our ARIA extracts portions of the solar disk corresponding to active regions by means of pattern recognition in which the unit length

**Figure 2** Temporal distribution of our sample of 370 active regions over Solar Cycle 23. Shown are the median observation times (color symbols) of each region together with the monthly-averaged sunspot number (curve).



is one supergranular diameter (40 arcsec). A typical example is shown in Figure 1. An active region is chosen for further study if its flux-weighted centroid, shown by the black crosses in the selected regions of Figure 1, falls within the above-mentioned  $60^\circ$  meridional zone. Notice, for example, that NOAA AR 10487 is selected in Figure 1 because its flux-weighted centroid lies within the above zone; parts of it, however, extend beyond this area.

Besides the automatic active-region selection process, each selected magnetogram (out of a total of 17 733) was manually examined to exclude portions of other active regions that might intrude in the field of view. For example, NOAA AR 10486 in Figure 1 is included in its selection circle, but the square circumscribed on this circle crops sizable parts of NOAA ARs 10489 and 10491 in its northwestern edge. These parts have been excluded in the subsequent analysis. Generally our ARIA performs quite well in distinguishing active regions but few incidences such as the above have been noted, especially in cases of densely populated active-region complexes, or “nests”, such as the one believed to have occurred during the October–November “Halloween” 2003 period (Zhou *et al.*, 2007). For our analysis, ARIA uses a maximum tolerated magnetic-flux imbalance of 50% in a given active region and a minimum active-region linear size of one supergranular diameter. For each of the 370 selected active regions we created a timeseries consisting of up to  $\approx 60$  magnetograms taken every 96 minutes corresponding to the approximately four-day period needed for each active region to traverse the  $60^\circ$ -analysis zone.

To document the major-flare history for each active region we browsed *i*) NOAA’s GOES X-ray archive and *ii*) the *Yohkoh*/HXT flare catalog (available online, at <http://gedas22.stelab.nagoya-u.ac.jp/HXT/catalogue/>). From the total of 370 active regions, 77 were unambiguously found to have hosted at least one M-class or X-class flare, while within  $\pm 30^\circ$  of the central meridian, with a total of 24 X-class flares and 87 M-class flares. Our active-region sample roughly covers Solar Cycle 23, as shown in Figure 2. The solar cycle is represented by a five-point running mean of the monthly-averaged sunspot number obtained by the Solar Influences Data Analysis Center (SIDC) of the Royal Observatory of Belgium.

In addition to the above SOHO/MDI sample, our analysis includes three nearly simultaneous magnetograms of NOAA AR 10930, observed on 11 December 2006. The line-of-sight components of these magnetograms are depicted in Figure 3. Figure 3(a) shows the Level 1D magnetogram (preferred over Level 2 data in order to better qualify for comparison with SOHO/MDI Level 1.5 data) acquired by the Spectropolarimeter (SP: Lites, Elmore, and Stander, 2001) of the *Solar Optical Telescope* (SOT) onboard the *Hinode* satellite and has a very high spatial resolution ( $\approx 0.32$  arcsec) with a linear pixel size of  $\approx 0.158$  arcsec. Figure 3(b) shows the respective magnetogram taken by the SOHO/MDI high-resolution, partial-disk magnetograph, with a coarser linear pixel size of 0.605 arcsec.

**Figure 3** Nearly simultaneous, coaligned magnetograms of NOAA AR 10930, acquired on 11 December 2006: observations are from (a) *Hinode*'s SOT/SP, (b) SOHO/MDI high-resolution, partial-disk magnetograph, and (c) SOHO/MDI full-disk magnetograph. The linear pixel sizes are 0.158 arcsec, 0.605 arcsec, and 1.98 arcsec for (a), (b), and (c), respectively. Shown is the line-of-sight magnetic-field component saturated at  $\pm 2.5$  kG (a),  $\pm 1$  kG (b), and  $\pm 1.8$  kG (c). Tic mark separation in all images is 10 arcsec.

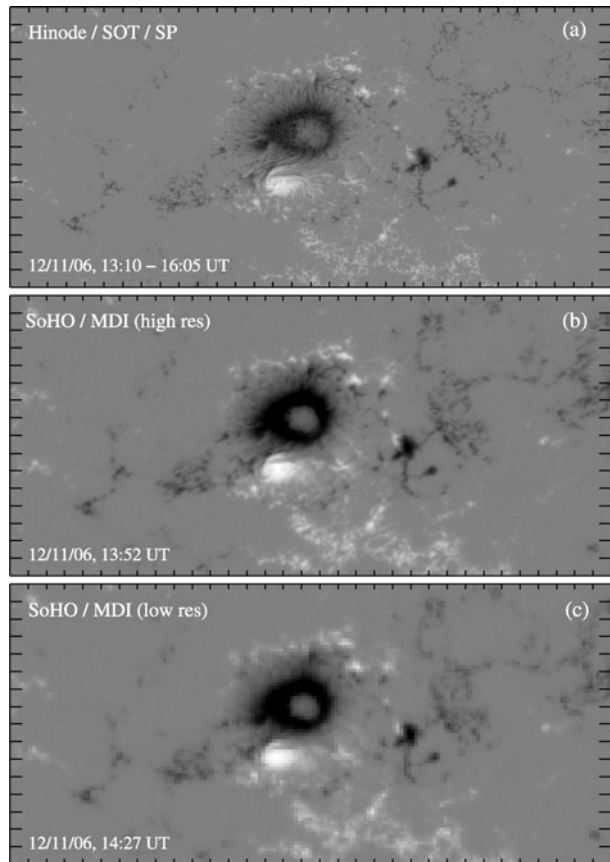


Figure 3(c) shows the Level 1.5 SOHO/MDI magnetogram extracted by a full-disk measurement with a much coarser linear pixel size of 1.98 arcsec. The three magnetograms have been initially coaligned by means of the pointing information provided separately for each. To further correct and deal with small pointing inconsistencies, coalignment has been completed by a rigid displacement (translation) over the E–W and the N–S axes. Displacements are determined by the peak of the cross-correlation function between a given pair of images, with cross-correlation functions inferred by means of fast Fourier transforms.

The three distinctly different spatial resolutions of the magnetograms of Figure 3 will be useful when testing the sensitivity of our scale-free and multiscale parameters to varying spatial resolution (Section 3).

## 2.2. Scale-free and Multiscale Techniques

The first parameter that we calculate is the scale-free, two-dimensional *fractal dimension* [ $D_0$ ] of the active-region magnetograms. To calculate  $D_0$  we cover the magnetogram field of view with a rectangular grid consisting of square boxes with linear size  $\lambda$  and area  $\lambda \times \lambda$ . Assuming that the field of view is a square with linear size  $L$  and area  $L \times L$ , the number of boxes needed to cover it is  $(L/\lambda)^2$ . Each of the boxes will have a dimensionless area  $\varepsilon^2$ , where  $\varepsilon = \lambda/L$ . Of the total  $(L/\lambda)^2$  boxes we count those that include part of the boundary



of a strong-field magnetic configuration (see below for the adopted strong-field definition). Then, varying the box size  $\lambda$  or, equivalently, the dimensionless size  $\varepsilon$ , we obtain different numbers  $[N(\varepsilon)]$  of information-carrying boxes. Correlating the various numbers  $N(\varepsilon)$  with the respective box sizes  $\varepsilon$ , we obtain the scaling relation

$$N(\varepsilon) \propto (1/\varepsilon)^{D_0}. \tag{1}$$

For a non-fractal, Euclidean structure embedded on a plane we have  $N(\varepsilon) = (L/\lambda)^2 = (1/\varepsilon)^2$ , so  $D_0 = 2$ . If  $D_0 < 2$ , we have fractal structures with a scale-free, incomplete filling of the field of view. The stronger the departure of  $D_0$  from its Euclidean value of two, the finer the structure exhibited by the studied magnetic configuration. For  $D_0 \leq 1$  in a two-dimensional fractal, the structures are typically scattered into a scale-free hierarchy of small “islands”, resembling what is known as *fractal dust* (see, e.g., Schroeder, 1991).

We infer the fractal dimension  $D_0$  by a least-squares best fit of the scaling relation of Equation (1). The uncertainty associated with the value of  $D_0$  is equal to the uncertainty of the regression fit. To guarantee a reliable inference of  $D_0$ , we demand that the dynamical range represented by the least-squares fit exceeds one order of magnitude. A very small fraction of magnetograms of non-flaring active regions ( $\approx 0.6\%$ , or 111 magnetograms) happen not to comply with this requirement because of the regions’ simplicity and scattered configurations; these magnetograms have been excluded from the analysis. Nonetheless, each of the 370 active regions of our sample fulfills the requirement with at least one magnetogram.

McAteer, Gallagher, and Ireland (2005), relying on a substantial data set of  $\approx 10^4$  active regions, first reported that flaring regions have fractal dimensions  $D_0 \geq 1.2$ . Their finding was statistical, of course, meaning that the  $D_0 \geq 1.2$  condition should be viewed as a necessary, but not sufficient, condition for major flare productivity. They also concluded, and we test their result here, that intensely flaring active regions showed statistically higher fractal dimensions.

To better compare with the results of McAteer, Gallagher, and Ireland (2005), we follow their criterion when outlining the boundaries of active regions: first, we use a threshold of 50 G in the strength of the line-of-sight field component in order to define the outer contours of strong-field magnetic patches. Then we impose a lower limit of 20 pixels for the length of each contour, thus rejecting very small patches that could as easily belong to the quiet Sun. As an additional condition, we impose a lower flux limit of  $10^{20}$  Mx for each patch. For the MDI low-resolution data this is nearly equivalent to saying that at least 100 pixels within the patch should have a line-of-sight field strength of at least 50 G, which is our threshold. Of course, a selected patch can contain fewer than 100 (but more than 20) pixels but with larger field strength in order to satisfy the flux condition.

The second parameter that we calculate is the *multifractal structure-function spectrum* (Frisch, 1995). The spectrum is given by

$$S_q(r) = \langle |\Phi(\mathbf{x} + \mathbf{r}) - \Phi(\mathbf{x})|^q \rangle \tag{2}$$

and it does not rely on box counting or thresholding, contrary to  $D_0$ . Instead, on the magnetic-flux distribution  $[\Phi(\mathbf{x})]$  of the active-region photosphere we define a *displacement* vector  $[\mathbf{r}]$ , also called the separation vector, and calculate the variation of the flux at this displacement. The variation is then raised to the power  $q$ , where  $q$  is a real, preferably positive number called the *selector*. Spatial averaging ( $\langle \rangle$ ) of the structure function over  $\mathbf{x}$  and all possible orientations of  $\mathbf{r}$  gives rise to a unique, positive value  $S_q(r)$  of the structure function for a given pair ( $r = |\mathbf{r}|, q$ ). The resulting spectrum involves a range of  $r$ -values and a fixed value of  $q$ ; different spectra are obtained for different  $q$ -values.

The multifractal structure function is designed to highlight the intermittency present in a magnetic-flux distribution (Abramenko *et al.*, 2002, 2003). In the case of a multifractal, intermittent flux distribution, the structure function  $[S_q(r)]$  exhibits a power law,

$$S_q(r) \propto r^{\zeta(q)}, \quad (3)$$

within a range of displacements, often referred to as the turbulent inertial range. The upper and lower extremes of the  $r$ -range correspond to, respectively, the maximum size of structures entering the inertial range and the scale over which ideal cascading of energy to smaller scales breaks down by dissipative effects. Higher values of the inertial-range scaling index  $\zeta(q)$  indicate a higher degree of intermittency, with  $\zeta(q) = q/3$  implying absence of intermittency.

Abramenko, Yurchyshyn, and Wang (2008) studied the structure-function spectrum and implemented an additional suggestion by Frisch (1995) to examine the *flatness function*  $f = S_6(r)/S_3(r)^3 \propto r^{-\delta}$ , where  $\delta$  is viewed as the *intermittency index* with higher values implying a higher degree of intermittency. They concluded that photospheric and coronal magnetic fields are both intermittent, with the intermittency in the photosphere preceding that in the corona and the corona responding to photospheric increases of intermittency. In their analysis, they used data from the same active region we show in Figure 3, namely, NOAA AR 10930, observed by *Hinode*/SOT/SP and SOHO/MDI high-resolution magnetographs, although not on the same day with the data used in this study.

Georgoulis (2005) used the structure function  $S_q(r)$  of Equation (3) and the inertial-range scaling exponent  $\zeta(q)$  to show that the photospheric magnetic fields of the six active regions of the study were indeed multifractal and intermittent, departing strongly from  $\zeta(q) = q/3$ . More importantly, Georgoulis (2005) presented an example of a X3 flare that occurred in NOAA AR 10030, where the intermittency peaked  $\approx 1-2$  hours prior to the flare and decreased sharply after the flare. The decrease was permanent and  $\zeta(q)$  continued decreasing  $\approx 1.5$  hours later, when an M1.8 flare also occurred in the active region (Figure 7 of Georgoulis, 2005). The change in the degree of intermittency was best seen for a selector  $q \in (3, 3.5)$ . Here we investigate whether this distinct behavior, seen in only *one* example, is part of a systematic tendency. To this purpose we study the temporal evolution of the scaling index  $\zeta(q = 3)$ , inferred by a least-squares best fit of the scaling relation of Equation (3). The uncertainty of the regression fit is treated as the uncertainty of the value of  $\zeta(3)$ . For the uncertainty of the  $\zeta(3)$ -differences we simply propagate the uncertainties of the two  $\zeta(3)$ -values that make these differences.

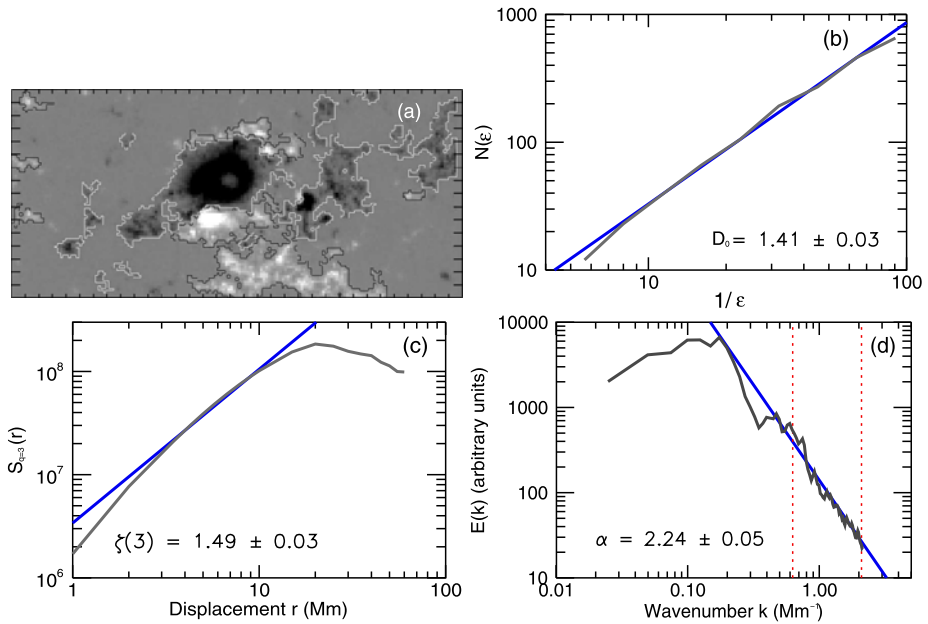
The third parameter that we study is the *turbulent power spectrum*  $[E(k)]$ . In the case of a turbulent flux system, there exists an inertial range of wavenumbers  $[k]$  reflected on a power-law form for  $E(k)$ :

$$E(k) \propto k^{-\alpha}, \quad (4)$$

where  $\alpha$  is the inertial-range exponent. We demand at least one order of magnitude as the dynamical range of the least-squares best fit used to infer  $\alpha$ , and we attribute the uncertainty of the fit to the uncertainty of  $\alpha$ . Like  $S_q(r)$  and unlike  $D_0$ , no box counting or thresholding is required to infer  $\alpha$ .

Abramenko (2005) suggested that the  $k$ -range corresponding to length scales  $r \in (3, 10)$  Mm should be scaled according to the representative  $\alpha$ -value for high-resolution MDI magnetograms. Although we use MDI low-resolution data for this analysis, we follow Abramenko's suggestion and make sure that the (3, 10) Mm scale range is included in the power-law fit. We also attempt to test the conclusion of Abramenko (2005), relying on a sample





**Figure 4** Typical calculation of the scale-free and multiscale parameters that will be used to quantify the complexity of solar active regions. The example refers to the low-resolution SOHO/MDI magnetogram of Figure 3(c), shown in (a). The magnetogram is saturated at  $\pm 1$  kG. Contours indicate the areas where the line-of-sight field strength exceeds the threshold of 50 G. Tic mark separation is 10 arcsec. Also shown are (b) the scaling relation of Equation (1) yielding the fractal dimension  $D_0$ , (c) the structure function  $S_{q=3}(r)$  of Equation (2), yielding the inertial-range scaling index  $\zeta(3)$ , and (d) the turbulent power spectrum of Equation (4), yielding the inertial-range scaling exponent  $\alpha$ . The two dotted lines indicate the wavenumbers of the desired length scales of 10 Mm ( $k < 1$ ) and 3 Mm ( $k > 1$ ). Gray curves in (b), (c), and (d) correspond to  $N(\epsilon)$ ,  $S_{q=3}(r)$ , and  $E(k)$ , respectively, while the blue lines are the respective least-squares best fits.

of 16 high-resolution MDI active-region magnetograms, that the inertial-range exponent  $\alpha$  reflects the future flare productivity of an active region, with larger  $\alpha$ -values implying a higher flare index (Figure 8 of Abramenko, 2005). It is also important to mention here Abramenko’s (2005) conclusion that the scaling index  $\alpha$  is not particularly useful for the prediction of imminent flares in the active regions studied.

A typical calculation of the fractal dimension  $D_0$ , the inertial-range scaling index  $\zeta(3)$ , and the scaling exponent  $\alpha$  of the turbulent power spectrum for the low-resolution MDI magnetogram of Figure 3(c) is depicted in Figure 4.

With the exception of the turbulent power spectrum, Georgoulis (2005) used all of the above methods, including the spectrum of multifractal generalized correlation dimensions. The latter showed that the six active regions of the sample had clearly multifractal photospheric magnetic fields. The method is not used in this study, however, because in Georgoulis (2005) it clearly failed to distinguish between flaring and non-flaring regions even for the handful of active regions studied.

The objective of this work is to test the flare-predictive capability of the above – reported to be promising – parameters. This capability will be tested by comparison with the capability of a standard, traditional parameter reflecting the size of active regions, namely, the

**Table 1** Values and uncertainties (in parentheses) of the unsigned magnetic flux  $\Phi_{\text{tot}}$ , the fractal dimension  $D_0$ , the inertial-range scaling exponent  $\zeta(3)$ , and the power-spectrum index  $\alpha$  for the three nearly simultaneous and coaligned magnetograms of NOAA AR 10930 acquired on 11 December 2006 (Figure 3).

Ref. (Figure)	Observation Time (UT)	Pixel size (arcsec)	$\Phi_{\text{tot}}$ ( $\times 10^{22}$ Mx)	$D_0$	$\zeta(3)$	$\alpha$
3(a)	13:10–16:05	0.158	2.85	1.54 (0.04)	1.35 (0.03)	3.00 (0.02)
3(b)	13:52:01	0.605	2.12	1.43 (0.02)	1.67 (0.04)	3.32 (0.04)
3(c)	14:27:01	1.980	3.60	1.41 (0.03)	1.49 (0.03)	2.24 (0.05)

### unsigned magnetic flux

$$\Phi_{\text{tot}} = \int_S |B_n| \, dS, \quad (5)$$

where  $B_n$  is the normal magnetic-field component (approximated by the line-of-sight field component near disk center) over the magnetograms' field of view [ $S$ ]. Flaring regions are statistically more flux-massive than non-flaring ones. As a result, the unsigned flux is considered a "standard" flare-forecasting criterion that, however, is not without limitations (see, *e.g.*, Leka and Barnes, 2003), especially when it comes to flux-massive, but quiescent, active regions. For a parameter to be characterized as having a significant predictive capability, it has to perform better than the unsigned flux.

### 3. Dependence of Scale-Free and Multi-Scale Parameters on the Spatial Resolution

Prior to analyzing our extensive MDI dataset we perform a sensitivity test of the parameters introduced in Section 2.2 to the spatial resolution of the studied magnetogram. Ideally, a parameter reliable enough to distinguish flaring from non-flaring active regions should be fairly insensitive to varying spatial resolution. If this were not the case, then one should at least be able to model the parameter's variations with changing resolution. If these conditions are not fulfilled, likely threshold values of the parameter that one may use to identify flaring regions before they flare are resolution-dependent and, as a result, instrument-dependent.

We use the three magnetograms of NOAA AR 10930 shown in Figure 3 to test the parameter values on data with varying spatial resolution. The results are provided in Table 1 for the parameters  $\Phi_{\text{tot}}$  [Equation (5)],  $D_0$  [Equation (1)],  $\zeta(q=3)$  [Equation (3)], and  $\alpha$  [Equation (4)]. Our findings can be summarized as follows:

- i) Despite coalignment and near simultaneity, the unsigned magnetic flux [ $\Phi_{\text{tot}}$ ] shows distinct differences for the three different magnetograms: the MDI low-resolution magnetogram (Figure 3(c)) shows  $\approx 25\%$  larger flux than the SOT/SP magnetogram (Figure 3(a)), while the MDI high-resolution magnetogram (Figure 3(b)) shows  $\approx 28\%$  less flux than the SOT/SP magnetogram. Some additional testing, not shown here, has been performed in an attempt to explain these large differences. In particular, attempting to degrade the highest-resolution magnetograms (SOT/SP and high-resolution MDI) to simulate situations of a larger pixel size (2 arcsec and more) we find a very weak decreasing trend for the unsigned flux that reaches up to  $\approx 3.5\%$  between the highest- (original) and the lowest- (degraded) resolution magnetogram. Likely, therefore, the  $\approx 30\%$  flux difference is not due to the different spatial resolution. Similar results are obtained when the spatial resolution of the SOT/SP and high-resolution MDI data is

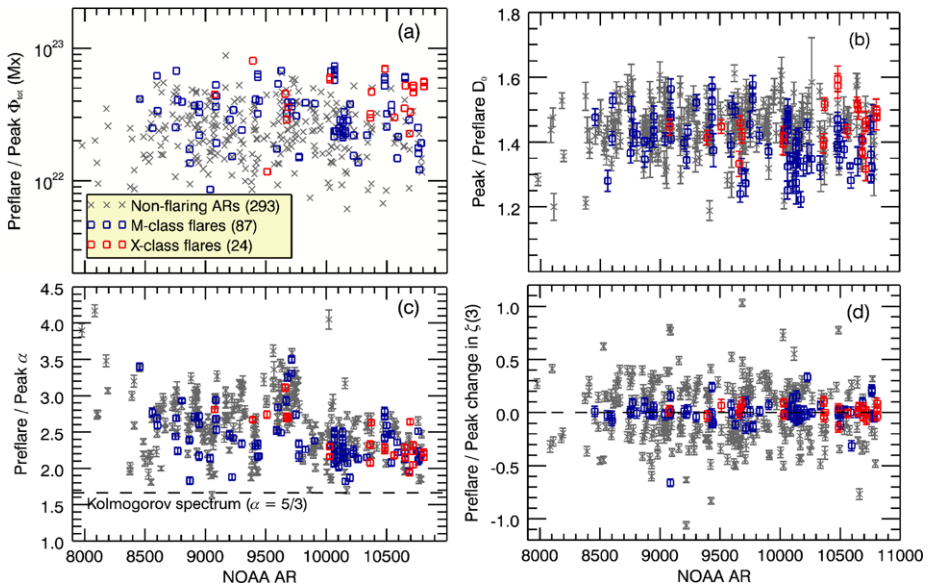
decreased by resampling. We cannot be certain about the source(s) of the discrepancy, but, given that we have used SP and MDI data of similar calibration levels, one might attribute this discrepancy to differences in the observations, processing, and calibration between the SP and the two MDI magnetographs. Discussing those differences exceeds the scope of this work.

- ii) The values of the scale-free fractal dimension [ $D_0$ ] are fairly consistent, despite the widely different spatial resolution and the different instruments. One notices a significant (*i.e.*, beyond error bars) decreasing tendency for decreasing resolution but the overall  $D_0$ -decrease for the  $\approx 13$ -fold difference in resolution between the SOT/SP and the low-resolution MDI data is only  $\approx 8.5\%$ . This is probably because the fractal dimension qualitatively highlights the morphological complexity of the studied self-similar structure that is being reflected adequately on seeing-free (SOT/SP and MDI) magnetograms largely regardless of spatial resolution and magnetic-flux content.
- iii) The values of the multiscale inertial-range scaling exponent [ $\zeta(3)$ ] and the power-spectrum scaling index [ $\alpha$ ] appear strongly dependent on the spatial resolution and/or other instrumental characteristics. The variation of both indices is not even monotonic, with their peak values corresponding to the intermediate case of the high-resolution MDI magnetogram. One might speculate that this happens because different spatial resolution changes quantitatively, but perhaps not qualitatively, the multiscale character of the data. In this sense, despite different parameter values, all three magnetograms of NOAA AR 10930 show significant intermittency ( $\zeta(3) \gg 1$ , with lack of intermittency reflected on  $\zeta(3) = 1$ ) and non-Kraichnan/non-Kolmogorov turbulence ( $\alpha \gg 3/2$  and  $5/3$ , respectively).

The susceptibility of the multiscale parameters  $\zeta(3)$  and  $\alpha$ , but not of the scale-free parameter  $D_0$ , to the spatial resolution implies caution when utilizing multiscale parameters to distinguish flaring from non-flaring active regions. At the very least, quantitative results in this case should not be generalized to different data sets. We therefore stress that the results described in the next sections for the multiscale parameters correspond *exclusively* to the MDI full-disk spatial resolution of  $\approx 2$  arcsec.

#### 4. Comparison of Parameters for Flaring and Non-flaring Active Regions

To determine whether any of the fractal or multifractal parameters  $D_0$ ,  $\zeta(3)$ , and  $\alpha$ , including  $\Phi_{\text{tot}}$  as a reference, can distinguish flaring from non-flaring active regions, we perform two tests: a more stringent one that compares the *preflare* (96 minutes in advance, at most, per the cadence of the full-disk MDI magnetograms) values of the parameters for flaring active regions to the *peak* values of the parameters for non-flaring regions, and a more liberal one that compares the peak values of the parameters for both flaring and non-flaring regions. Finding a distinguishing pattern in the first test would mean that the studied parameter may have a short-term predictive capability. If the first test fails but the second test gives some distinguishing patterns, the studied parameter provides clues about the expected flare productivity of an active region, without necessarily implying when flares will occur. This claim is found in multiple instances in the literature (see, *e.g.*, McAteer, Gallagher, and Ireland, 2005 for  $D_0$ ; Abramenko, 2005 and Hewett *et al.*, 2008 for  $\alpha$ ; Conlon *et al.*, 2008 for other multifractal parameters).



**Figure 5** Comparison between the preflare values of scale-free and multiscale parameters of flaring active regions and the respective peak values of non-flaring regions. Shown are (a) the unsigned magnetic flux  $\Phi_{tot}$ , (b) the fractal dimension  $D_0$ , (c) the turbulent power-spectrum index  $\alpha$ , and (d) the change in the inertial-range scaling exponent  $\zeta(3)$ .

#### 4.1. Preflare vs. Peak Non-flaring Parameter Values

Figure 5 depicts the preflare values of  $\Phi_{tot}$  (Figure 5(a)),  $D_0$  (Figure 5(b)), and  $\alpha$  (Figure 5(c)). It also provides the change between the preflare and the postflare values of  $\zeta(3)$  (Figure 5(d)) for flaring regions, compared with the peak  $\zeta(3)$ -change for non-flaring ones. Flaring regions are divided into “M-flaring” (regions that have given at least one M-class, but not a X-class, flare; blue squares) and “X-flaring” (regions that have given at least one X-class flare; red squares). Since peaks of the studied parameter timeseries are taken, each active-region timeseries has been inspected separately to remove spurious effects in the parameters’ evolution. The most prominent source of these effects is contamination due to flare emission, in the case of large white-light flares, with temporary instrumental or data problems playing a secondary role. In case spurious effects are detected, the affected parameter value is replaced by the value interpolated for a given time.

Inspecting Figure 5, we first notice that only the  $\Phi_{tot}$ -values of the flaring regions (Figure 5(a)) show some tendency to occupy the upper  $\Phi_{tot}$ -range in the plot. The preflare values of the fractal dimension  $D_0$  (Figure 5(b)) appear to be more or less uniformly distributed between  $\approx 1.2$  and  $\approx 1.6$ , with a mean value of  $\approx 1.41$  and a standard deviation of  $\approx 0.08$ . For non-flaring regions, the peak fractal dimension has a mean of  $\approx 1.44$ , with a standard deviation  $\approx 0.14$ . Qualitatively, we reproduce the result of McAteer, Gallagher, and Ireland (2005) who found  $D_0 \gtrsim 1.2$  for flaring regions, but we also find that  $D_0 \gtrsim 1.2$  for *all* active regions in our sample.

A similar behavior is seen when the scaling index  $\alpha$  of the turbulent power spectrum is examined (Figure 5(c)). Indeed, the preflare  $\alpha$ -values show a mean  $\approx 2.4$  and a standard deviation  $\approx 0.32$ , while the peak  $\alpha$ -values for the non-flaring regions have a mean  $\approx 2.60$  with a standard deviation  $\approx 0.42$ . No active region shows a  $\alpha$ -value smaller than the Kolmogorov

index of  $5/3$  and very few regions, among them four M-flaring ones, show  $\alpha < 2$ . We conclude that a strong departure from a Kolmogorov turbulent spectrum is *not* a characteristic of *some* (flaring) active regions but one of *most* active regions. Given the  $\alpha$ -dependence on spatial resolution, however (Section 3), we cannot be certain about the “true”  $\alpha$ -value.

For the multifractal inertial-range scaling exponent  $\zeta(3)$  we have compared the change in values between the preflare and the postflare phase with the peak change in values for non-flaring active regions (Figure 5(d)). This was chosen because in Georgoulis (2005) we inferred a significant, permanent decrease in  $\zeta(3)$  from preflare to postflare in a single flaring region. Unfortunately, this feature does not survive here, where more comprehensive statistics are involved: for the 111 major flares included in our sample (24 X-class, 87 M-class) the host active regions show a preflare/postflare increase in  $\zeta(3)$  in 59 cases, with a decrease between the preflare and postflare  $\zeta(3)$ -values inferred in the remaining 52 cases. Clearly, the peak  $\zeta(3)$  changes do not correspond to flaring active regions with the exception of the two M-flaring regions NOAA AR 9087 and 10596, which show two of the sharpest  $\zeta(3)$ -decreases in the postflare phase, with amplitudes 0.66 and 0.31, respectively. If these two regions were studied in isolation and one ignored the  $\zeta$ -dependence on the spatial resolution, then one might have concluded that large flares indeed relate to sharp decreases in  $\zeta(3)$ , meaning a decrease of the degree of the photospheric intermittency in the active regions after the flare. Given our spatial-resolution test and the large active-region sample, however, such a conclusion is unjustified.

The apparent failure of the first, stringent test comparing the preflare values of the studied parameters for flaring regions with the respective peak values for non-flaring ones indicates that none of the scale-free and multiscale parameters shows any notable short-term flare prediction capability or, at least, any better predictive capability than the conventional unsigned magnetic flux.

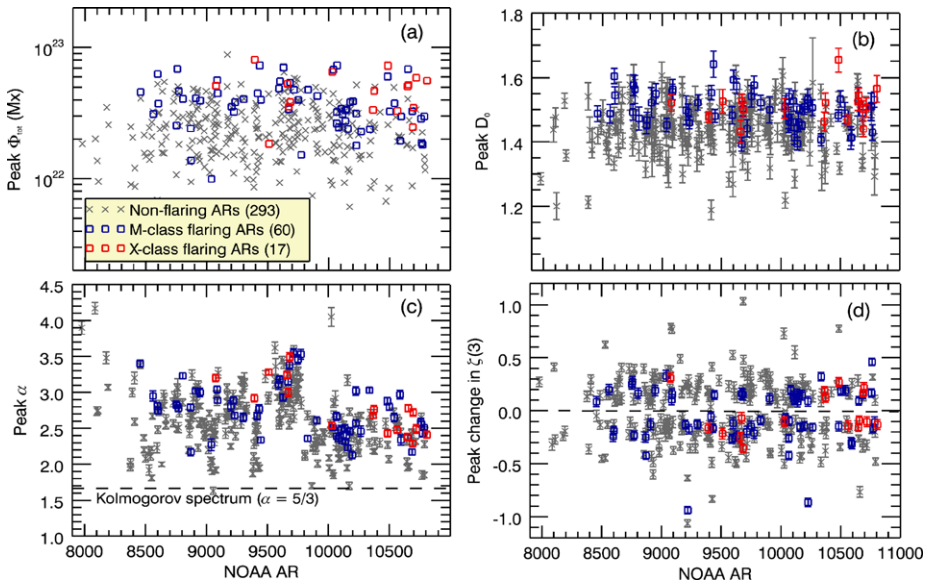
#### 4.2. Peak Flaring vs. Peak Non-flaring Parameter Values

We now perform the second test by comparing the peak values of the studied parameters for both flaring and for non-flaring regions. The results of this test are shown in Figure 6.

Figure 6(a) depicts the results for the unsigned magnetic flux  $\Phi_{\text{tot}}$ . It shows more clearly than Figure 5(a) that the peak  $\Phi_{\text{tot}}$ -values tend to occupy the upper part of the  $\Phi_{\text{tot}}$ -range. Somewhat more tell-tale is the difference between Figures 5(b) and 6(b) in terms of the preflare and the peak fractal dimension, respectively: the peak  $D_0$ -values for flaring regions in Figure 6(b) also tend to occupy the upper part of the  $D_0$ -range, meaning that flaring regions statistically tend to have higher fractal dimension, as McAteer, Gallagher, and Ireland (2005) previously reported.

Regarding the indices  $\alpha$  of the turbulent power spectrum (Figure 6(c)), there is no distinct difference with Figure 5(c). The peak  $\alpha$ -values for flaring regions also tend to occupy the higher  $\alpha$ -range but with larger dispersion than the fractal dimension  $D_0$ . This being said, the active regions with the highest peak  $\alpha$ -values in our sample happen to be non-flaring ones.

When the peak  $\zeta(3)$  change for both flaring and non-flaring regions is considered (Figure 6(d)) we find that flaring regions show a similar pattern with non-flaring ones. Only for the X-flaring regions there seems to be a weak statistical preference for stronger  $\zeta(3)$ -decreases as compared to increases, with a ratio 11:6. The probability that this preference is by chance, however, is rather high, of the order 0.09. This probability was calculated by means of a binomial probability function, assigning a 0.5 probability that the peak  $\zeta(3)$ -change will be positive and assuming 11 positive chance “hits” out of 17 independent trials (since the  $\zeta(3) > 0$  probability is 0.5 the binomial distribution becomes symmetric with



**Figure 6** Comparison between the peak values of scale-free and multiscale parameters of flaring active regions and the respective peak values of non-flaring regions. Shown are (a) the unsigned magnetic flux  $\Phi_{tot}$  (b) the fractal dimension  $D_0$  (c) the turbulent power-spectrum index  $\alpha$ , and (d) the change in the inertial-range scaling exponent  $\zeta(3)$ .

respect to chance hits, so identical results would be reached in case we assumed six negative chance “hits” out of 17 trials). For M-flaring regions, stronger  $\zeta(3)$ -decreases barely dominate, with a ratio 32:28. This time, however, the binomial probability that this result is random is  $\approx 3 \times 10^{-14}$ , so we can safely conclude that there is no clear preference of  $\zeta(3)$ -decreases over increases in case of M-flaring regions. For non-flaring regions, the peak  $\zeta(3)$ -changes are almost evenly divided between decreases and increases, with a ratio 146:147, which is again not random (the binomial probability that this result is random, given the large sample size, is practically zero). Overall, it becomes clear that one cannot use the pre-flare (Figure 5(b)) or the peak (Figure 6(b)) change in  $\zeta(3)$  to assess the flaring productivity of an active region, meaning that flaring regions do *not* show sharp flare-related changes in their degree of intermittency.

Table 2 quantifies Figures 5 and 6, providing means and standard deviations for each depicted distribution. It shows that only the peak values of the unsigned flux  $\Phi_{tot}$  and the fractal dimension  $D_0$  are somewhat different between flaring and non-flaring regions but the respective dispersions are such that there is considerable mixing of values between the three active-region populations. For the preflare values of  $\Phi_{tot}$  and  $D_0$  there is even more mixing and, in terms of  $D_0$ , X- and M-flaring regions are practically indistinguishable. When it comes to  $\alpha$ -values and changes in  $\zeta(3)$ , Table 2 – along with Figures 5 and 6 – shows that these multiscale parameters simply cannot be used to distinguish flaring from non-flaring regions, let alone predict large flares within a given time span.

### 4.3. Flare-Forecasting Probabilities

In Sections 4.1, 4.2 we found that neither the preflare nor the peak values of our scale-free and multiscale parameters seem capable of distinguishing flaring from non-flaring regions.



**Table 2** Summary of means and standard deviations (in parentheses) for the preflare and peak values of  $\Phi_{\text{tot}}$ , the scale-free  $D_0$ , and multiscale parameters  $\alpha$  and  $\zeta(3)$ , calculated in our sample of 17 X-flaring, 60 M-flaring, and 293 non-flaring active regions. The preflare active-region values correspond to 24 X-class and 87 M-class flares. The discrepancy between numbers of flaring regions and flares arises because some flaring regions flare repeatedly over the observing interval.

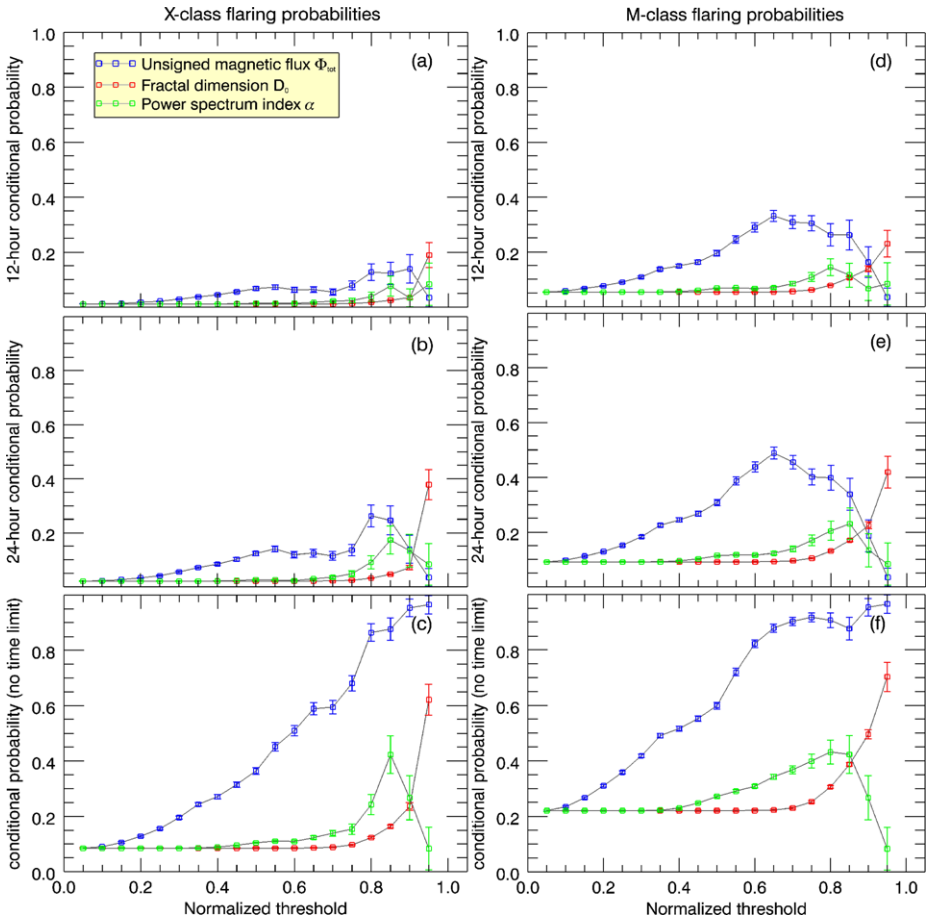
Active Regions	Preflare values		Peak values		
	X-flaring	M-flaring	X-flaring	M-flaring	Non-flaring
Data points	24	87	17	60	293
$\Phi_{\text{tot}}$ ( $\times 10^{22}$ Mx)	4.57 (1.63)	3.55 (1.72)	4.74 (1.68)	3.84 (1.56)	2.58 (1.21)
$D_0$	1.44 (0.07)	1.40 (0.08)	1.51 (0.05)	1.50 (0.05)	1.44 (0.13)
$\alpha$	2.38 (0.29)	2.40 (0.33)	2.77 (0.36)	2.73 (0.36)	2.60 (0.42)
$\zeta(3)$ -change	0.012 (0.06)	-0.001 (0.11)	-0.03 (0.20)	-0.04 (0.26)	-0.004 (0.29)

The unsigned flux  $\Phi_{\text{tot}}$  tends to score better than the scale-invariant  $D_0$ , the multiscale  $\alpha$ , and the change in  $\zeta(3)$ . To further quantify these results we calculate here the conditional probability of an active region being a flaring one if a given parameter inferred from any one of its magnetograms exceeds a preset threshold. A way to do this is by using Laplace’s rule of succession and proceeding to a Bayesian inference of the predictive probability as follows: assume that  $F$  magnetograms of flaring regions and  $N$  magnetograms of non-flaring ones exhibit a value  $R$  of a parameter that exceeds a threshold  $R_{\text{thres}}$ . Then, the conditional probability  $p$  that an active region with  $R > R_{\text{thres}}$  will be a flaring one is given by (Jaynes, 2003, pp. 155 – 156)

$$p = \frac{F + 1}{N + 2} \quad \text{with uncertainty } \delta p = \sqrt{\frac{p(1 - p)}{N + 3}}. \tag{6}$$

This probability rule was also used by Wheatland (2005) to test another solar-flare prediction method. To compare directly between the conditional probabilities of the various parameters, we normalize the thresholds with respect to the maximum value of each parameter appearing in Figures 5 and 6. We examine only three of the four parameters –  $\Phi_{\text{tot}}$ ,  $D_0$ , and  $\alpha$  – because the changes of  $\zeta(3)$  obviously show very similar patterns for flaring and non-flaring regions. Using the NOAA/GOES and *Yohkoh*/HXT flare catalogs (Section 2.1), we consider a given active-region magnetogram as a preflare one if a major flare happened in the region within a given, preset timeframe from the time that the magnetogram was recorded. Figure 7 shows conditional probabilities for two timeframes: 12 hours (Figure 7(a), (d)) and 24 hours (Figure 7(b), (e)), while Figures 7(c) and (f) show conditional probabilities without any timeframe assigned: if an active region flared at any time after the magnetogram was taken, then this magnetogram is considered a preflare one. Notice that the flares under examination may have occurred when a given region has moved beyond the 30° W limit of the analysis zone. This does not affect the analysis, however, as the preflare magnetograms were acquired when the region was still within the analysis zone.

All plots of Figure 7 imply that the unsigned flux  $\Phi_{\text{tot}}$ , a conventional activity predictor, is generally more effective in predicting major flares than both the scale-free fractal dimension  $D_0$  and the multiscale turbulent power-spectrum index  $\alpha$ . Differences between  $\Phi_{\text{tot}}$  and ( $D_0$ ,  $\alpha$ ) are smaller (but also reflect small flare probabilities, of limited practical use) in the case of the most demanding prediction, the one with a 12-hour timeframe for flares  $> X1.0$  (Figure 7(a)). In all other cases  $\Phi_{\text{tot}}$  gives much higher (well beyond error bars) probabilities than  $D_0$  and  $\alpha$ . The predictive ability of  $D_0$  appears comparable with, or



**Figure 7** Conditional probabilities of active regions to host a major flare, either X-class (left column) or M-class (right column), with respect to the normalized (against the maximum) threshold of a given parameter, with  $\Phi_{\text{tot}}$  (blue squares),  $D_0$  (red squares), and  $\alpha$  (green squares) examined. The upper (a, d) and middle (b, e) rows provide the 12- and 24-hour conditional probabilities, respectively. The lower row (c, f) provides the probability without a time limit, that is, the probability of major flaring at a future time when the active region is still visible in the disk. The maximum values against which the thresholds were normalized are  $8.8 \times 10^{22}$  Mx, 1.65, and 4.17 for  $\Phi_{\text{tot}}$ ,  $D_0$ , and  $\alpha$ , respectively.

slightly higher than, that of  $\Phi_{\text{tot}}$  only for normalized thresholds  $R_{\text{thres}} \geq 0.9$  for the 12- and 24-hour prediction timeframes. For the same timeframes, the predictive ability of  $\Phi_{\text{tot}}$  drops for  $R_{\text{thres}} \gtrsim 0.8$  (Figures 7(a), (b)) and  $R_{\text{thres}} \gtrsim 0.6$  (Figures 7(d), (e)). This is because the upper  $\Phi_{\text{tot}}$ -ranges in these cases are occupied by non-flaring (within the preset timeframes) active regions – this is one of the limitations for using the unsigned flux as a flare predictor. The power-spectrum index  $\alpha$  exhibits similar behavior, but for higher  $R_{\text{thres}} \gtrsim 0.8$ , in all plots of Figure 7. Comparing the multiscale  $\alpha$  with the scale-free  $D_0$ , we note that  $\alpha$  works somewhat better, especially for larger timeframes. This is in line with Abramenko’s (2005) suggestion that  $\alpha$  better reflects future flare productivity. However, recall that  $\alpha$  depends sensitively on the spatial resolution of the observing instrument, contrary to  $D_0$  (Table 1).

Hence the results of Figure 7 concerning  $\alpha$  should be viewed as holding exclusively for MDI low-resolution magnetograms.

## 5. Summary and Conclusion

This study investigates previous claims on the efficiency of fractal and multifractal techniques as reliable predictors of major solar flares and/or parameters reflecting the overall flare productivity of solar active regions before they actually flare. From the array of parameters implemented in the literature we select three of the reported most promising ones: the fractal dimension, the multifractal intermittency index, and the scaling index of the turbulent power spectrum. Our objective is not to judge the methods *per se*, but, rather, to test the notion of utilizing fractality and multifractality to gain predictive insight into major solar flares.

Statistical analyses such as this one must guarantee that the assembled active-region sample is representative: the sample must contain numerous flaring *and* non-flaring regions. Comprehensive statistics often help avoid the interpretation of incidental signals as statistically significant behavior. Section 4.1 (Figure 5(d)) includes examples of results that might have been interpreted in a misleading way had the statistics of our active-region sample been insufficient.

We study 370 SOHO/MDI low-resolution (1.98'' per pixel) timeseries of active-region magnetograms, 293 of which correspond to active regions without major flares and 77 correspond to M- and X-class flaring regions. MDI line-of-sight fields are used for regions within 30° of the central meridian in order to approximate the longitudinal-field component with the normal-field component and avoid any corrections or otherwise modifications of the original MDI data. We find that neither scale-free (fractal) nor multiscale (multifractal) techniques can be used to predict major flares, or for the *a-priori* assessment of the flaring productivity of active regions. In particular, we find that their diagnostic capability is not better than that of the unsigned magnetic flux of active regions, a traditional, but unreliable, activity predictor. Since the fractal and multifractal measures tested here are less effective than the unsigned flux (Figure 7), they should not be used for flare prediction or for flaring productivity assessment.

On the fundamental question of whether flaring active regions are more fractal, multifractal, or turbulent than other, non-flaring ones, the answer *per* our results has to be negative: flaring regions tend to exhibit relatively large peak values of scale-free and multiscale parameters but these values, or even higher ones sometimes, are also exhibited by non-flaring regions. For all statistical distributions, the means and standard deviations are such that the different populations of flaring and non-flaring regions overlap considerably (Table 2).

At this point we emphasize our willingness to follow the guidelines of multiple previous studies in the inference of the above fractal and multifractal parameters. In particular, we followed McAteer, Gallagher, and Ireland (2005) when inferring the fractal dimension  $D_0$ , Abramenko (2005) when inferring the turbulent scaling index  $\alpha$  (despite the fact that Abramenko worked exclusively on high-resolution MDI magnetograms), and a previous work of this author (Georgoulis, 2005), together with Abramenko *et al.* (2003), when inferring the intermittency index  $\zeta(q)$ . As a result, the findings of both McAteer, Gallagher, and Ireland (2005) and Abramenko (2005) were qualitatively reproduced in this analysis, while we showed that the distinct  $\zeta(3)$ -behavior reported by Georgoulis (2005) was just one incidental case and not part of a systematic trend.

In addition, this work (Section 3) exposes a dependence of multiscale parameters  $\zeta(q)$  and  $\alpha$  on the spatial resolution of the studied magnetograms. In contrast, the scale-free  $D_0$

appears fairly insensitive to varying spatial resolution. Therefore, results and comparisons for  $\zeta(3)$  and  $\alpha$  in Section 4 are valid only for MDI low-resolution data and should not be generalized to data sets of other instruments. Possible susceptibility of the  $D_0$ -value should also be studied with respect to the threshold that it requires, unlike  $\zeta(3)$  and  $\alpha$ . This investigation has not been carried out here. In previous works, however, Meunier (1999) reported a decreasing trend of  $D_0$  with increasing threshold, while Janßen, Vögler, and Kneer (2003) reported a slighter decrease, or a near insensitivity, of  $D_0$  for increasing thresholds, in case these thresholds are sufficiently above noise levels or the magnetic-field data have been treated for noise, respectively.

It is useful to mention here a very recent result by Abramenko and Yurchyshyn (2010) that the turbulent power-spectrum index  $\alpha$ , either alone or coupled with the integral of the power-spectrum for all wavenumbers, correlates better than  $\Phi_{\text{tot}}$  with the flaring index in a large sample of 217 active regions recorded in high-resolution MDI magnetograms. While correlating some parameter with the flaring index is not identical to inferring the predictive capability of this parameter, these results appear in likely contrast with the results presented here. Further investigation is clearly needed, therefore. Nonetheless, some convergence of views appears in that multiscale parameters may not be ideal tools for solar-flare prediction (V. Abramenko, 2010, private communication).

Perhaps more instructive than pointing out the inability of scale-free and multiscale techniques to assess *a priori* the flaring record of active regions is to explain *why* this is the case. In this author's view, there are at least two distinct reasons that justify our findings:

First, fractality and multifractality are extremely widespread in the solar atmosphere, eruptive and quiescent alike. This may well be due to the turbulence dominating the magnetic-flux generation and emergence process (see Introduction). For example, recall the fractality of white-light granules (Roudier and Muller, 1987; Hirzberger *et al.*, 1997), the fractality and multifractality of active regions and the magnetic field of the quiet Sun (Schrijver *et al.*, 1992; Cadavid *et al.*, 1994; Meunier, 1999; Janßen, Vögler, and Kneer, 2003), the fractality of flares and sub-flares in the EUV (Aschwanden and Parnell, 2002; Aschwanden and Aschwanden, 2008a, 2008b), the fractality of the quiet network in the EUV (Gallagher *et al.*, 1998), that of Ellerman bombs in off-band H $\alpha$  (Georgoulis *et al.*, 2002), and others. The fractal dimension in most, if not all, of these works varies between 1.4 and 1.8, practically indistinguishable from the fractal dimension of active regions found here. As a result, it appears unlikely that these same methods may reflect particular characteristics of active regions, let alone flare productivity.

Second, there is a lack of correlations between the fractal dimension in the photosphere and that of the overlying chromosphere and corona, where major flares occur. Dimitropoulou *et al.* (2009) assumed nonlinear force-free magnetic fields extending above the photosphere and calculated volumes of enhanced electric currents and steep magnetic gradients from these extrapolated fields. They found no correlation between the three-dimensional fractal dimension of these volumes and that of the two-dimensional photospheric boundary. In other words, all photospheric "memory", in terms of fractality and multifractality, is erased above the photosphere due to the fact that these unstable volumes become nearly space-filling slightly above this boundary. Attempting to assess the fractality of layers higher than the photosphere – where flares occur – by using the photospheric fractality as a proxy will not yield meaningful results, similarly to the lack of correlation between photospheric electric currents and the coronal X-ray brightness (Metcalf *et al.*, 1994).

In addition, it is possible that both flaring and non-flaring regions share a similar degree of self-organization in the distribution of their magnetic free energy, as reported by Vlahos and Georgoulis (2004). Flaring regions have an "opportunity" to show their self-organization

via flaring, with flares inheriting the statistics of their host active regions, while non-flaring regions retain this property without demonstrating it. In this sense *i*) fractality alone cannot be responsible for flaring, and *ii*) fractality, as a global characteristic of the active-region atmosphere, cannot be used to determine *a priori* which active regions will flare.

There are, of course, sophisticated multiscale techniques not treated in this work, such as wavelet methods used to extract the magnetic-energy spectrum in active regions (Hewett *et al.*, 2008) or to distinguish active regions from the quiet Sun for further treatment (Conlon *et al.*, 2010), or the flatness function and its intermittency index (Abramenko, Yurchyshyn, and Wang, 2008). While we cannot comment on methods that we have not tested, per our conclusions it would seem rather surprising if a scale-free or multiscale technique delivered a notable improvement in our forecasting ability, as this would apparently contradict what scale-free and multiscale behavior caused by self-organization is meant to imply: spontaneity in the system's dynamical response to external forcing, both in timing and in amplitude, and hence a lack of certainty in predicting this response.

Let us finally mention that alternative flare-prediction approaches have been developed in recent years. Rather than fractality, multifractality, or intermittency and turbulence, these methods rely on parameters stemming from morphological and topological characteristics of active regions, such as those of the photospheric magnetic-polarity inversion lines or photospheric properties in general (Falconer, Moore, and Gary, 2006; Schrijver, 2007; Georgoulis and Rust, 2007; Leka and Barnes, 2007; Mason and Hoeksema, 2010), or those of the subsurface kinetic helicity prior to active-region emergence (Reinard *et al.*, 2010), among others. It remains to be seen whether these parameters can lead to advances in the forecasting of major solar eruptions or whether forecasting will remain inherently probabilistic which, per our results, seems entirely possible. In any case, fractal and multifractal methods – perhaps not extremely useful as eruption predictors – will always be excellent tools for a fundamental understanding of the origins and nature of solar magnetism.

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