

1 On the local Hurst exponent of geomagnetic field
2 fluctuations: Spatial distribution for different
3 geomagnetic activity levels

Paola De Michelis¹ and Giuseppe Consolini²

Correspondence to: Paola De Michelis, Istituto Nazionale di Geofisica e Vulcanologia, Via di Vigna Murata 605, 00143 Roma, Italia; Phone: +390651860315; Email: paola.demichelis@ingv.it.

¹Istituto Nazionale di Geofisica e
Vulcanologia, 00143, Roma, Italy.

²INAF-Istituto di Astrofisica e
Planetologia Spaziali, 00133, Roma, Italy.

4 **Abstract.** This study attempts to characterize the spatial distribution
5 of the scaling features of the short time scale magnetic field fluctuations ob-
6 tained from 45 ground based geomagnetic observatories distributed in the
7 northern hemisphere. We investigate the changes of the scaling properties
8 of the geomagnetic field fluctuations by evaluating the local Hurst exponent
9 and reconstruct maps of this index as a function of the geomagnetic activ-
10 ity level. These maps permit us to localize the different latitudinal structures
11 responsible for disturbances and related to the ionospheric current systems.
12 We find that the geomagnetic field fluctuations associated with the differ-
13 ent ionospheric current systems have different scaling features, which can be
14 evidenced by the local Hurst exponent. We also find that, in general, the lo-
15 cal Hurst exponent for quiet magnetospheric periods is higher than that for
16 more active periods suggesting that the dynamical processes that are acti-
17 vated during disturbed times are responsible for changes in the nature of the
18 geomagnetic field fluctuations.

1. Introduction

19 It is well known that the magnetic field observed at the Earth's surface is not constant,
20 but subjected to variations on all time scales [Merrill *et al.*, 1996]. Fluctuations with
21 periods from a few tens of minutes up to two hundreds minutes are of primary interest
22 in this study. These fluctuations are the results of both regular and irregular variations
23 related to the interaction between the solar wind and the Earth's magnetosphere. As a
24 result of this interaction a considerable amount of energy is continuously released, giving
25 rise to a number of fast phenomena that occur in the magnetosphere and polar upper at-
26 mosphere. Examples include: electric fields, large scale plasma motions, electric currents,
27 aurorae, magnetic substorms and storms, and so on. Within this system, observations of
28 ground-based magnetometer stations can provide an excellent indicator of space weather
29 conditions and thus serve as a remote sensing tool of distant magnetospheric processes.
30 That is consequence of the property of the magnetic field lines to focus and converge as
31 they approach the Earth and consequently to give us the opportunity to see mapped on
32 the Earth all the nonlinear plasma processes that occur in different regions of the mag-
33 netosphere. Indeed, the dynamics of the Earth's magnetosphere in response to the solar
34 wind changes is mainly complex, nonlinear and multi-scale [Tsurutani *et al.*, 1990; Con-
35 solini *et al.*, 1996; Consolini and Chang, 2001; Sharma *et al.*, 2001; Uritsky *et al.*, 2002;
36 Consolini *et al.*, 2005, 2008; Consolini and De Michelis, 2014]. Its multi-scale nature,
37 which manifests in the absence of a single characteristic spatial and/or temporal scale
38 in response to the solar wind changes [Lui *et al.*, 2000; Sitnov *et al.*, 2001; Consolini,
39 2002; De Michelis *et al.*, 2012], is widely provided by the scale-invariance of geomagnetic

40 and magnetospheric observations (global and/or in situ time series of magnetic field and
41 plasma parameter measurements).

42 Our goal in this paper is to capture the essential characteristics of geomagnetic fluc-
43 tuations at the Earth's surface and at the same time to establish the dynamics of the
44 system responsible of such fluctuations. We characterize changes in the statistics of the
45 geomagnetic field fluctuations evaluating the local Hurst exponent, measured from a single
46 ground-based magnetometer station. This analysis is applied on time interval contains
47 both several days of low geomagnetic activity and a severe magnetic storm. Whereas
48 storms of small or moderate intensity are nothing extraordinary, more severe storms with
49 field depression of about -300 nT are sometimes not observed for years (or even decade)
50 and are thus significant geophysical events. It is the reason why we have selected magnetic
51 data recorded on July, 2000 at 45 geomagnetic observatories in the northern hemisphere.
52 The selected period contains one of the largest historical geomagnetic storms: the Bastille
53 event of 14-16 July 2000.

54 We use the Hurst exponent for investigation of the essential characteristics of the geo-
55 magnetic field fluctuations during different geomagnetic activity levels because this quan-
56 tity, which is a measure of the way in which a data series varies in time, can be used to
57 obtain significant results on the characterization of the dynamical systems. The Hurst
58 exponent can be used to characterize the persistence of a system, e.g., whether the sign of
59 the fluctuations will remain the same (persistent) or change (anti-persistent) in the next
60 time interval. Since in the case of temporal variations, the geomagnetic field does not
61 exhibit a simple monofractal scaling behavior which can well described as a single scaling
62 exponent, but is often characterised by a scaling behavior which is more complex, it is

63 necessary to introduce different scaling exponents for different parts of the series for a
64 full description of the scaling behavior [*Consolini et al.*, 1996; *Consolini and De Miche-*
65 *lis*, 1998; *Sitnov et al.*, 2000, 2001; *Wanliss*, 2005; *Uritsky et al.*, 2002]. In this case, a
66 local fractal analysis must be applied and the time series showing different local scaling
67 features is said to be *multifractal*. If we use the Hurst exponent to characterize the
68 properties of a time series, it will be better to introduce a local Hurst exponent because
69 its scaling properties are not constant. Indeed, it is of extreme importance to correctly
70 quantify the long-range correlations of the geomagnetic time series in order to gain a deep
71 understanding of the complex system dynamics that give rise to the recorded geomagnetic
72 signal.

73 In recent years, there has been increasing interest in the analysis of the Hurst exponent of
74 geomagnetic signals. However, we have found no studies which analyze the magnetic field
75 fluctuations obtained from a large number of ground based observatories to reconstruct the
76 global temporal and spatial evolution of the local Hurst exponent in order to characterize
77 the scaling features of fluctuations.

78 The aim of this paper is therefore to investigate the spatial and temporal distribution
79 of the local Hurst exponent in the northern hemisphere, to examine the time evolution
80 of the spatial structure according to different geomagnetic activity levels and to attempt
81 an interpretation of these spatial-temporal fluctuation structures in terms of different
82 ionospheric current systems and convection patterns.

83 The paper is organized as follows. At first, the data sources are discussed then a
84 brief summary of detrended moving average (DMA) technique to evaluate the local Hurst

85 exponent is presented. Following this, DMA technique is applied to the selected dataset.
86 Finally, the implications of the findings are discussed.

2. Data

87 The present work focuses on the analysis of the time fluctuations of the Earth's magnetic
88 field from 1st to 31st July 2000. This time interval contains both periods of relatively low
89 geomagnetic activity and periods characterized by the occurrence of intense geomagnetic
90 storms. Indeed, the selected period contains one of the largest historical geomagnetic
91 storms: the Bastille Day event of 14-16 July 2000. It was an extreme space weather
92 event that led to significant damage to satellites and other technological infrastructure.
93 We analyze the scaling features of the horizontal component of the geomagnetic field, as
94 this is mainly affected by magnetospheric dynamics. The dataset is obtained from 45
95 magnetic observatories distributed in the northern hemisphere. All the selected obser-
96 vatories are part of the worldwide network of observatories known as INTERMAGNET.
97 Therefore, we make use of recordings only obtained by permanent observatories fulfill-
98 ing international standards. Indeed, the high data quality especially a good stability
99 of instruments guarantees that our targets can be reached. Fig. 1 shows the distribu-
100 tion of the selected observatories in the geomagnetic reference system. The geograph-
101 ical and magnetic coordinates of these observatories, their magnetic local time (MLT),
102 their L-shell values and their International Association of Geomagnetism and Aeronomy
103 (IAGA) codes are listed in Table 1. These quantities for the year 2000 are calculated using
104 NASA-service (omniweb.gsfc.nasa.gov/vitmo/cgm_vitmo.html). One-minute sampling data
105 have been downloaded either from the World Data Center for Geomagnetism, Edinburgh
106 (www.wdc.bgs.sc.uk) or from the INTERMAGNET website (www.intermagnet.org).

3. Method of analysis: detrending moving average

107 To date various methods have been developed and introduced to estimate the generalized
108 Hurst exponent: the rescaled range (R/S) analysis [*Hurst*, 1951], the wavelet transform
109 module maxima (WTMM) approach [*Holschneider*, 1988; *Muzy et al.*, 1991; *Bacry et*
110 *al.*, 1993; *Muzy et al.*, 1993, 1994], the fluctuation analysis (FA) [*Peng et al.*, 1992], the
111 detrended fluctuation analysis (DFA) [*Peng et al.*, 1995], the detrending moving average
112 (DMA) technique [*Alessio et al.*, 2002], and so on. In our present work, we focus on
113 a moving average method, the so-called DMA technique. This method, which is based
114 on the analysis of the scaling features of the local standard deviation around a moving
115 average, is quite simple and seems to be more accurate than other methods [*Carbone et al.*,
116 2004]. It is commonly used to quantify signals where large high-frequency fluctuations may
117 mask characteristic low-frequency patterns. Comparing each data point to the moving
118 average, DMA method determines whether data follow the trend, and how deviations from
119 the trend are correlated. In this way, the method addresses the problem of accurately
120 quantifying long-range correlations in non-stationary fluctuating signals.

121 **DMA method consists of the following steps.** Let $y(i)$ be a stochastic time
122 series defined in the interval $[0, N]$. This time series $y(i)$ (with $i = 1, 2, \dots, N$) is
123 divided into non-overlapping segments of equal length s . Since the length N of the series
124 is often not a multiple of the considered time scale s , a short part at the end of the
125 profile may remain. In order not to disregard this part of the series, the same procedure
126 is repeated starting from the opposite end. Thereby, $2N_s$ ($N_s = \text{int}(N/s)$) segments
127 are obtained altogether. For each of the $2N_s$ segments, the first step of DMA method
128 is to detect trends in data employing a moving average, which can be a simple moving

129 average or weighted one. Once the moving average is obtained, the signal is detrended
130 by subtracting the average value of the time series $y(i)$ over each segment. Successively,
131 the fluctuation (i.e. the standard deviation) $F(s)$ of the signal is determined. This last
132 quantity is calculated for different values of the moving average window s over the interval
133 $[s, N]$. It is so possible to obtain the fluctuation function $F(s)$ as function of the scale
134 s and consequently to analyze the relation between these two quantities. If a power
135 law relation between the fluctuation function $F(s)$ and the scale s is found, it will be
136 interpreted as an indication of a self-similar behavior which is obtained for long-memory
137 correlated processes. The power law relation $F(s) \sim s^H$ **allows us to estimate** the local
138 scaling Hurst exponent (H) of the series without any a priori assumption on the stochastic
139 process and on the probability distribution function of the random variables entering the
140 process [*Carbone et al.*, 2004]. From the value of H we have a measure of the long-term
141 memory of the time series and gain some insight into its dynamics. The value of the
142 Hurst exponent let us ascertain whether the analyzed time series has an anti-persistent
143 or persistent behavior. It has been shown that a Hurst exponent value between 0 and
144 0.5 exists for time series with an *anti-persistent behavior*. This means that an increase
145 will tend to be followed by a decrease (or a decrease will be followed by an increase).
146 Conversely, a Hurst exponent value between 0.5 and 1 indicates a *persistent behavior*, so
147 that an increase (decrease) in values will be followed by an increase (decrease) in the short
148 term - that is, the time series is trending. The larger the Hurst exponent value is, the
149 stronger the trend. Series of this type are easier to predict than series falling in the other
150 category. Lastly, a Hurst exponent value close to 0.5 indicates that there is no correlation
151 in sign between successive increments.

152 In our work we are interested in the analysis of the geomagnetic fluctuations in the high-
153 frequency domain, which corresponds to a temporal scale lower than 100/200 minutes.
154 This temporal scale characterizes the fast magnetotail relaxation processes associated
155 with the loading-unloading component of the magnetospheric/magnetotail dynamics (see
156 e.g. *Kamide and Kokubun* [1996]; *Consolini et al.* [2005] and references therein). For
157 this reason, in DMA technique we choose a time window of 801 points to ensure an
158 optimal noise/signal ratio in determining the local Hurst exponent. It has been shown
159 by *Consolini et al.* [2013] using a synthetic signal of $5 \cdot 10^5$ points, that for this time
160 window (801 points) the local Hurst exponent estimated using DMA technique can be
161 determined with an average precision equal to 10%. Thus, the selected time window is
162 a good compromise between the time domain of the magnetic fluctuations that we can
163 analyze and the need to have sufficient statistical power for the local Hurst exponent
164 estimation.

4. Analysis and Results

165 As described in the previous Section, we employ DMA analysis to determine the sta-
166 tistical nature of our signals. We consider a period of one month from 1st to 31st July,
167 2000 and DMA is used to determine the temporal evolution of the local Hurst exponent
168 evaluated considering the horizontal component (with 1 min resolution) of the Earth's
169 magnetic field measured in the selected 45 permanent geomagnetic observatories reported
170 in Table 1. An example of our results is shown in Fig. 2 where the trend of the local
171 Hurst exponent is presented in the case of nine geomagnetic observatories distributed
172 mainly in Canada. They are nine permanent observatories approximately with the same
173 magnetic longitude and a magnetic latitude ranging between 87° N and 40° N. They are

174 located: three (ALE, RES and CBB) inside the polar cap, three (YKC, BLC and FCC)
175 in the auroral zone and three (MEA, NEW and BOU) immediately below the auroral
176 zone (see Table 1 for details). The position of these observatories offers the opportunity
177 to analyze both areas with a direct influence of the solar wind (where the magnetic field
178 lines are open) and areas where the influence of the solar wind is indirect and the internal
179 magnetosphere dynamics plays a key role.

180 As shown in Fig. 2 the intermittent character of the analyzed time series is the result
181 of a superposition of structures (set of fluctuations) characterized by different values of
182 the local Hurst exponent. The nature of the signals seems to be very close to that of a
183 multifractional brownian motion [*Lim and Muniandy, 2000*], which is characterized by a
184 non-stationarity of the scale invariance properties. We underline that the *multifractional-*
185 *ity* should not be confused with the *multifractality*. In the case of a multifractal signal, the
186 scaling features are function of the fluctuation amplitudes, i.e. of the local crowding of the
187 measure, so that the Hurst exponent depends on the fluctuation amplitudes. Conversely,
188 for a multifractional time series the Hurst exponent is a function of time, i.e. $H = f(t)$.
189 The values of the local Hurst exponent, reported in Fig. 2, are in the interval $[0, 1]$, and
190 consequently, the analyzed time series are characterized at scales below 100 minutes both
191 by fluctuations that tend to induce stability within the system (where the Hurst exponent
192 value is between 0 and 0.5), and by fluctuations with a *persistent behavior*, implying a
193 dynamics governed by a positive feedback mechanism. In the time interval chosen, we
194 select 4 consecutive days characterized by a low geomagnetic activity level (6, 7, 8, and 9
195 July, 2000) and 4 days during which the Bastille event occurred (from 15 July (14:37) to
196 19 July (14:36)). We choose the three-hour Kp index to discriminate between different

197 levels of magnetospheric activity. We could use other indices, for example $SYM - H$ or
198 AE , but ranging the magnetic latitude of the selected observatories between 14° N and
199 87° N, we choose Kp since this index, as a mid-latitude index, would reflect the mean
200 magnetospheric activity. In particular, the days of low activity level correspond to the
201 quietest days of July, 2000. It should be noted that as the general disturbance level may
202 be quite different for different years and also for different months of the same years, the
203 selected quietest days of a month may sometimes be rather disturbed or viceversa. In our
204 case the selected days refer to a value of $Kp < 3$.

205 These two samples (6 - 9 July and 15 - 19 July) are chosen to better assess the potential
206 of the local Hurst exponent to reveal the transitions in magnetograms during periods
207 characterized by low and disturbed geomagnetic activity levels.

208 Fig. 3 shows the distributions of the local Hurst exponent values during the Bastille
209 event (from 15 to 19 July, 2000) at the nine different geomagnetic observatories chosen
210 as sample. These probability distribution functions are obtained using a Gaussian kernel
211 method as described in *Kaiser and Schreiber* [2002]. Looking at Fig. 3, there is an increase
212 of anti-persistent behavior of the signal with the decreasing of latitudinal values (from ALE
213 to MEA) which is due to the existence of a greater number of periods characterized by
214 local H values less than 0.5. The three higher latitude stations are consistent with local
215 Hurst exponent distribution shapes centered on local H values greater than 0.5, implying
216 time series characterized by long memory effects. On the contrary, local Hurst exponent
217 distribution shapes centered on local H values lower than 0.5 characterize the geomagnetic
218 observatories, located at lower latitudes (YKC, FCC and MEA). At the end, the other two
219 observatories NEW and BOU, which are located below the auroral zone, show local Hurst

220 exponent value distributions similar to those of the geomagnetic observatories located at
221 higher latitude.

222 To visualize easily the dependence of the local H values on the latitude we report in
223 Fig. 4 the average values of the local Hurst exponent in the nine selected geomagnetic
224 observatories during both the disturbed period (red markers) and the quiet one (black
225 markers). Fig. 4 reveals that there is a sharp dependence of the Hurst exponent values on
226 the latitude. The Hurst exponent values decrease moving from polar regions to auroral
227 ones and then increase again at mid latitude. The most interesting findings are the
228 position of the minimum, which is different moving from quiet to disturbed periods, and
229 the values of the local Hurst exponent that are lower during disturbed period than quiet
230 one. The dependence of the local Hurst exponent values on the magnetic latitude may be
231 representative of the variability of the auroral electrojet position, namely the variability
232 of that electric current system flowing in the polar ionosphere within the auroral oval.
233 Although the auroral oval is usually located at high latitude, we can observe its expansion
234 towards lower latitudes during very high geomagnetic activity periods as that selected
235 in our present work. Thus, a possible explanation for this result may be the different
236 positions of the low and the high latitude boundary layers where the auroral electrojet
237 flows. A possible explanation of the lower values of the Hurst exponent during disturbed
238 periods than those relative to quiet ones might be the activation of different dynamical
239 processes. Indeed, during a magnetic storm the global ionospheric electric currents and the
240 associated magnetic variations increase in magnitude and exhibit rapid fluctuations. The
241 distributed magnetic perturbations are only partly associated with overhead ionospheric
242 currents, since a substantial portion comes from more distant magnetospheric currents

243 like the ring current and the field-aligned currents. The dynamical processes that are
244 activated during a magnetic storm, produce a change in the nature of the magnetic field
245 fluctuations, which will tend to induce stability within the current systems.

246 To confirm the above results we report in Fig. 5 and Fig. 6 polar view maps of the local
247 H values computed in each of the selected 45 geomagnetic observatories during different
248 days with a time resolution of 15 minutes. In detail, Fig. 5 shows our results during a quiet
249 day, while Fig. 6 shows our results in five different days during the different phases of the
250 Bastille geomagnetic storm as shown by the $SYM - H$ plot: before, during and after the
251 occurrence of the famous geomagnetic storm (panel a, b, c, d and e). To compute these
252 maps, data are reduced on a regular grid using a weighted Gaussian kernel interpolation
253 scheme. This method gives us the opportunity to use all the available data consisting of
254 the local Hurst exponent values as function of magnetic latitude and magnetic local time
255 and computing the local value on the map averaging with a weight that depends on the
256 distance as a Gaussian function.

257 The most interesting finding reported in Fig. 5 and Fig. 6 is the spatial distribution
258 of the local H values which shows a dependence on both the magnetic latitude according
259 to the results reported in Fig. 4, and the magnetic local time, showing a noon-midnight
260 asymmetry. Regardless of the geomagnetic activity level, indeed, H values are often higher
261 than 0.5 (blue colour) within the polar cap, i.e. that region where the magnetic field lines
262 stick right out into interplanetary space. However, the structure of the maps reported
263 in Fig. 5 and Fig.6 is completely different. During a geomagnetically quiet day (Fig. 5)
264 the local H values of the magnetic field fluctuations mainly show a persistent character
265 (blue color), except for three different zones. One of these covers the magnetic latitudes

266 from 70° N and 80° N on the morning side. In this case the change of the magnetic field
267 fluctuation character may be due to the presence of the eastward auroral electrojet. The
268 other two zones cover the magnetic latitudes from 20° N and 30° N on the morning side
269 and from 30° N and 50° N on the night side. These two zones correspond to the *solar*
270 *quiet* or S_q current system. This ionospheric current system is fixed with respect to the
271 Sun and it consists in two vortices on the dayside of the Earth, one in each hemisphere.
272 Seen from the Sun the two vortical currents are counter flowing in the two hemisphere
273 with their center located around 30° north or south magnetic latitude. Furthermore, in
274 the night time hemisphere there are also other two vortices rotating in opposite directions
275 with respect to the dayside ones and characterized by a weaker intensity [*Merrill et al.*,
276 1996]. Thus, we associate the smaller values of the local H exponent in Fig. 5 with these
277 S_q current ionospheric systems, one in the dayside and the other in the night one. The
278 different H values, which are smaller in the night sector than in the day one, emphasize
279 the more anti-persistent character of the magnetic field fluctuations in the nightside. This
280 suggests that at temporal scales lower than 200 minutes the dayside S_q current is more
281 stable showing no long term coherent variations.

282 Another important finding is the significant decrease in the values of the Hurst exponent
283 during the development of the analyzed geomagnetic storm as also shown in Fig. 4.
284 Looking at the maps reported in Fig. 6 there is a large decrease in the H values at all
285 magnetic latitudes during the main phase of the storm (panel b) and in the following
286 day (panel c) when the H values reach the absolute minimum of the analyzed disturbed
287 period. Thus, the magnetic fluctuations exhibit a relatively sudden change from more-
288 persistent ($H > 0.5$) to less-persistent pattern ($H < 0.5$) during the analyzed magnetic

289 storm suggesting the establishment of a dynamical phase characterized by anti-persistent
290 fluctuations. This may be related to the presence of a strong coherent electrojet and the
291 anti-persistent nature of short time scale fluctuations may be related to the stability of
292 such current system on longer time scale (long time average of current nearly constant).
293 Consequently, this type of analysis allows us to visualize zones where the stable current
294 systems flow. It is known that the position and the dimension of the auroral electrojet
295 current system is subject to strong temporal variations depending on the geomagnetic
296 activity level. Whereas both the polar cap and polar oval contract to relatively narrow
297 region around the magnetic pole during quiet condition, the diameter of the polar cap and
298 width of polar oval both expand during active conditions. In the strongest magnetospheric
299 storms, as the Bastille event, the auroral electrojets shift equatorward drastically. During
300 the main phase of intense storms, the westward electrojet can cover the latitude from 50°
301 N to 80 °N on the night side while the eastward electrojet flows in the dusk sector at
302 latitudes lower than those of the westward electrojet. With $SYM - H$ varying from 0
303 to -400 nT, the minimum latitude appeared to lower down from 67° N to 52° N. This
304 accords with our observations. Indeed, panel c) shows the presence of a minimum in the
305 H values between 70° N and 50° N in the morning sector and between 70° N and 60° N
306 in the evening one, which is consistent with the presence of the eastward electrojet in the
307 evening sector and a westward electrojet in the morning one.

5. Summary and Conclusions

308 The main goal of the current study was to characterize the spatial distribution of the
309 fractal behavior of the short time scale magnetic field fluctuations obtained from 45
310 ground-based geomagnetic observatories distributed in the northern hemisphere in or-

311 der to analyze and better understand the complex magnetospheric dynamics in response
312 to the solar wind changes. Since the geomagnetic time series are dominated by multi-
313 scale processes where the scaling exponent is no longer constant but a function of the
314 time, we used a time-dependent approach to find a local measurement of the degree of
315 the long-range correlations described by the temporal variations of scaling exponent. For
316 this reason, the local Hurst exponent was used to study of the scaling properties of the
317 geomagnetic field fluctuations during quiet and disturbed geomagnetic activity levels.

318 The local Hurst exponent images give us the opportunity to localize the different latitu-
319 dinal structures caused by different physical processes, and to study their time evolution
320 according to different geomagnetic activity levels. We find that the geomagnetic field fluc-
321 tuations associated with the different ionospheric current systems have different scaling
322 features, which can be evidenced by the local Hurst exponent. Furthermore, analyzing
323 the features of the geomagnetic field fluctuations we may visualize on our maps structures
324 caused by different physical processes. Processes characterized by a larger value of the
325 Hurst exponent are more regular and less erratic than processes characterized by a smaller
326 one.

327 We find the emergence of two distinct patterns: a pattern related to the occurrence
328 of intense geomagnetic storms and a pattern related to quiet periods. The first pattern
329 is characterized by a decreasing in the H values, which reaches its minimum near the
330 main phase of the storm, while the second pattern has fluctuations with a more persistent
331 character at scales below 100 minutes. Thus, the geomagnetic field fluctuations change
332 from a more to a less persistent character during the development of a strong geomagnetic
333 storm suggesting the establishment of a dynamical phase characterized by fluctuations

334 with an anti-persistent character at short time scale, which reflect the higher stability of
335 currents at short time scales. On the other hand, during disturbed periods associated
336 with the occurrence of intense geomagnetic storms the complexity and the multi-scale
337 nature of the magnetosphere response to the solar wind forcing is higher than during less
338 active periods [*De Michelis et al.*, 2012], reflecting the different processes that dominate
339 the dynamics of magnetosphere during quiet and disturbed periods. During disturbed
340 periods the magnetospheric dynamic is strongly affected by the impulsive and bursty
341 character of plasma transport in the equatorial magnetotail regions [*De Michelis et al.*,
342 1999]. This plasma transport process is characterized by a strong intermittent coherent
343 dynamics on short time scales [*Consolini and Chang*, 2001; *Klimas et al.*, 2000]. This
344 might be a possible alternative explanation for the origin of the anti-persistent short time
345 scale fluctuations observed during disturbed periods that can be understood in terms of
346 impulsive local current enhancements. During quiet periods the energy influx from the
347 solar wind is stored in the magnetosphere and slowly burned so to generate a more long
348 time correlated variation of current systems. That is the possible origin of the persistent
349 character of the fluctuations at short time scale observed during these periods. These
350 seem still to be consequence of a stochastic dynamics, similar to the global dynamics that
351 is characterized by a long-varying Markovian non-equilibrium relaxation process (see e.g.
352 *de Groot and Mazur* [1984]).

353 The findings of the current study seem to be different from those obtained in previous
354 research. In some published studies a transition from a random to a correlated state
355 is actually observed and discussed during the active periods of storms in the *Dst* index

356 [*Balasis et al.*, 2006] and the $SYM - H$ index [*Wanliss*, 2005; *Wanliss and Dobias*, 2007].

357 These differences may be explained considering some important points:

358 *i)* previous works [*Wanliss*, 2005; *Balasis et al.*, 2006; *Wanliss and Dobias*, 2007] use
359 time series of the geomagnetic indices for obtaining their results. This means that they
360 use time series calculated as an average of mid-latitude geomagnetic observatories after
361 taking into account the secular variation and the system of the external S_q currents at
362 each location. In contrast, here, the observatory data, to which DMA was applied, are
363 raw measurements;

364 *ii)* *Balasis et al.* [2006] and *Zaourar et al.* [2013] use hourly data whereas we use 1
365 minute resolution data;

366 *iii)* Hurst calculations by *Balasis et al.* [2006] and *Zaourar et al.* [2013] are made using
367 wavelet transform in the frequency domain. They estimate power spectral densities in the
368 time scale range from 2 to 128 hours, thus looking overall at longer period processes in
369 the magnetosphere than the present study.

370 However, by monitoring the temporal evolution of the fractal character in their time
371 series, a rapid change in their temporal scaling is found around the beginning of the main
372 phase of the geomagnetic storms. This finding is also supported by *Zaourar et al.* [2013],
373 where the dynamics of the external contributions to the geomagnetic field is investigated
374 by applying time-frequency methods to magnetic data recorded at three geomagnetic
375 observatories. Looking at their results we notice that during quiet times the values of
376 the spectral exponent β (where $\beta = 2H + 1$) are higher than during disturbed times,
377 supporting our findings. Thus, if it is true that we have an increase of the scaling exponent
378 values towards more persistent values around the beginning of the main phase of the

379 geomagnetic storms at mid-latitudes, it is also true that during the overall disturbed period
380 the observed H values decrease towards less persistent and/or anti-persistent values. Thus,
381 our findings provide evidence of the occurrence of a dynamical phase transition, which
382 occurs during the intense geomagnetic storms. This dynamical phase transition manifests
383 by a change of the persistent character of temporal-spatial fluctuations.

384 **In conclusion, this study shows the occurrence of dynamical changes in the**
385 **fluctuation scaling features on global scale and provides a clear correlation**
386 **between these scaling features and the current systems flowing in the iono-**
387 **sphere.**

388 **Acknowledgments.** The results presented in this paper rely on public data collected
389 at magnetic observatories and available by INTERMAGNET (www.intermagnet.org). We
390 thank the national institutes that support them and INTERMAGNET for promoting
391 high standards of magnetic observatory practice. The authors kindly acknowledge N.
392 Papitashvili and J. King at the National Space Science Data Center of the Goddard
393 Space Flight Center for the use permission of 1-min OMNI data and the NASA CDAWeb
394 team for making these data available. Giuseppe Consolini acknowledges funding from the
395 European Community's Seventh Framework Programme ([FP7/2007-2013]) under Grant
396 no. 313038/STORM. The elaborated data for this paper are available by contacting the
397 corresponding author (paola.demichelis@ingv.it).

References

398 Alessio E., A. Carbone, G. Castellini, and V. Frappietro (2002), Second-order moving
399 average and scaling of stochastic time series, *Eur. Phys. J., B* 27, 197-200.

- 400 Bacry, E., J. F. Muzy, and A. Arnéodo (1993), Singularity spectrum of fractal signals
401 from wavelet analysis: Exact results, *J. Stat. Phys.*, *70*, 635-674.
- 402 Balasis G., I. A. Daglis, P. Kapiris, M. Manda, D. Vassiliadis, and K. Eftaxias (2006),
403 From pre-storm activity to magnetic storms: a transition described in terms of fractal
404 dynamics, *Ann. Geophys.*, *24*, 3557.
- 405 Carbone, A., G. Castelli, and H. E. Stanley (2004), Time-dependent Hurst exponent in
406 financial time series, *Physica A*, *344*, 267-271.
- 407 Consolini G., M. F. Marcucci, and M. Candidi (1996), Multifractal structure of auroral
408 electrojet index data, *Phys. Rev. Lett.*, *76*, 4082.
- 409 Consolini G., and P. De Michelis (1998), Non-Gaussian distribution function of AE-index
410 fluctuations: evidence for time intermittency, *Geophys. Res. Lett.*, *25*, 4087.
- 411 Consolini G., and T. Chang (2001), Magnetic field topology and criticality in geotail
412 dynamics: relevance to substorm phenomena, *Space Sci. Rev.*, *95*, 309.
- 413 Consolini G. (2002), Self-organized criticality: a new paradigm for the magnetotail dy-
414 namics, *Fractals*, *10*, 275.
- 415 Consolini G., T. Chang, and A. T. Y. Lui (2005), Complexity and topological disorder
416 in the Earth's magnetotail dynamics, in *Nonlinear transitions in plasma*, Sharma A. S.
417 and P. Kam (eds.), Kluwer.
- 418 Consolini, G., and P. De Michelis (2005), Local intermittency measure analysis of AE
419 index: The directly driven and unloading component, *Geophys. Res. Lett.*, *32*, L05101,
420 doi:10.1029/2004GL022063.
- 421 Consolini G., P. De Michelis, and R. Tozzi (2008), On the Earth's magnetospheric dy-
422 namics: nonequilibrium evolution and the fluctuation theorem, *J. Geophys. Res.*, *113*,

- 423 A8, doi:10.1029/2008JA013074.
- 424 Consolini G., R. De Marco, and P. De Michelis (2013), Intermittency and multifractional
425 Brownian character of geomagnetic time series, *Nonlin. Processes Geophys.*, *20*, 455-466,
426 doi: 10.5194/npg-20-455-2013.
- 427 Consolini G. and P. De Michelis (2014), Permutation entropy analysis of complex magne-
428 topheric dynamics, *J. Atm Sol. Terr. Physics*, *115*, 25, doi: 10.1016/j.jastp.2013.11.005
- 429 De Michelis P., I. A. Daglis, and G. Consolini (1999), An average image of proton
430 plasma pressure and the ring current systems in the equatorial plane derived from
431 AMPTE/CCE-CHEM measurements, *J. Geophys. Res.*, *104*, 28615.
- 432 De Michelis P., G. Consolini, and R. Tozzi (2012), On the multi-scale nature of large ge-
433 omagnetic storms: an empirical mode decomposition analysis, *Nonlin. Processes Geo-*
434 *phys.*, *19*, 667, doi: 10.5194/npg-19-667-2012.
- 435 de Groot S.R. and P. Mazur (1984), *Non-equilibrium. Thermodynamics*, Dover, New York.
- 436 Holschneider, M. (1988), On the wavelet transformation of fractal objects' *J. Stat. Phys.*,
437 *50*, 963-993.
- 438 Hurst, H. E. (1951), Long-term storage capacity of reservoirs, *Trans. Amer. Soc. Civil*
439 *Eng.*, *116*, 770-808.
- 440 Kaiser A., and T. Schreiber (2002), Information transfer in continuous processes, *Physica*
441 *D*, *166*, 43, doi: 10.1016/S0167-2789(02) 00432-3.
- 442 Kamide, Y., and S. Kokubun (1996), Two-component auroral electrojet: Importance for
443 substorm studies, *J. Geophys. Res.*, *101*, 13027.
- 444 Klimas A. J., J. A. Valdivia, D. Vassiliadis, D. N. Baker, M. Hesse, and J. Takalo (2000),
445 Self-organized criticality in the substorm phenomena and its relation to localized recon-

- 446 nection in the magnetospheric plasma sheet, *J. Geophys. Res.*, *105*, 18765.
- 447 Lim, S.C., and S. V. Muniandy (2000), On some possible generalizations of fractional
448 Brownian motion, *Phys. Lett. A.*, *266*, 140.
- 449 Lui A. T. Y., S. Chapman, K. Liou, P.T. Newell, C. I. Meng, M. Brittnacher, and G-
450 K. Parks (2000), Is the dynamic magnetosphere an avalancing system?, *Geophys. Res.*
451 *Lett.*, *27*, 911.
- 452 Merrill R.T., M. W. McElhinny, and P. L. McFadden (1996), *The Magnetic Fields of the*
453 *Earth. Paleomagnetism, the Core and the Deep Mantle*, Academic Press.
- 454 Muzy, J. F., E. Bacry, and A. Arnéodo (1991), Wavelets and multifractal formalism for
455 singular signals: Application to turbulence data, *Phys. Rev. Lett.*, *67*, 3515-3518.
- 456 Muzy, J. F., E. Bacry, and A. Arnéodo (1993), Multifractal formalism for fractal sig-
457 nals: The structure-function approach versus the wavelet-transform modulus-maxima
458 method, *Phys. Rev. E*, *47*, 875-884.
- 459 Muzy, J. F., E. Bacry, and A. Arnéodo (1994), The multifractal formalism revisited with
460 wavelets, *Int. J. Bifurcat. Chaos*, *4*, 245-302.
- 461 Peng, C.-K. et al. (1992), Long-range correlations in nucleotide sequences, *Nature*, *356*,
462 168-170.
- 463 Peng, C.-K. et al. (1995), Mosaic organization of DNA nucleotides, *Phys. Rev. E*, *49*,
464 1685.
- 465 Sharma A. S., M. I. Sitnov, and K. Papadopoulos (2001), Substorms as nonequilibrium
466 transitions of the magnetosphere, *J. Atmos. Sol. Terr. Phys.*, *63*, 1399.
- 467 Sitnov M.I., A. S. Sharma, K. Papadopoulos, D. Vassiliadis, J. A. Valdivia, A. J. Klimas,
468 and D. N. Baker (2000), Phase transition-like behavior of the magnetosphere during

- 469 substorms, *J. Geophys. Res.*, *105*, 12955.
- 470 Sitnov M.I., A. S. Sharma, K. Papadopoulos, D. Vassiliadis, J. A. Valdivia, A. J. Klimas,
471 and D. N. Baker (2001), Modelling substorm and self-organized criticality to nonequi-
472 librium phase transitions, *Phys. Rev. E*, *65*, 016116.
- 473 Tsurutani B. et al. (1990), The nonlinear response of AE to the IMF Bs, *Geophys. Res.*
474 *Lett.*, *17*, 279.
- 475 Ukhorskiy A.Y., M. I. Sintov, A. S. Sharma, and K. Papadopoulos (2004), Global
476 and multiscale dynamics of the magnetosphere, *Geophys. Res. Lett.*, *31*, L08802, doi:
477 10.1029/2003GL018932.
- 478 Uritsky V. M., A. J. Klimas, D. Vassiliadis, D. Chua, and G. D. Parks (2002), Scale free
479 statistics of spatiotemporal auroral emissions as depicted by POLAR UVI images: The
480 dynamic magnetosphere is an avalanching system, *J. Geophys. Res.*, *107*, 1426.
- 481 Wanliss J. A. (2005), Fractal properties of SYM-H during quiet and active times, *J.*
482 *Geophys. Res.*, *110*, doi:10.1029/2004JA010544.
- 483 Wanliss, J. A., and K. Showalter (2006), High-resolution global storm index: Dst versus
484 SYM-H, *J. Geophys. Res.*, *111*, doi: 10.1029/2005JA011034.
- 485 Wanliss J.A., and P. Dobias (2007), Space storm as a phase transition, *J. Atmos. Sol.*
486 *Terr. Phys.*, *69*, 675.
- 487 Zaourar N., M. Hamoudi, M. Manda, G. Balasis, and M. Holschneider (2013), Wavelet-
488 based multiscale analysis of geomagnetic disturbance, *Earth Planets Space*, *65*, 1525.

Table 1. Geomagnetic observatories considered in this study. Geographical and corrected magnetic coordinates are given in degrees. MLT is given in UT (hours) at time when given point is at midnight. L-shell is given in Earth’s radii R_E . Stars indicate a selected number of geomagnetic observatories, that we use in Figs. 2, 3 and 4.

IAGA code	Lat	Long	MLat	MLong	MLT	L-shell
ALE*	82.50	297.65	87.08	99.42	21.76	∞
AQU	42.38	13.32	36.24	87.38	22.39	1.5
BDV	49.08	14.02	44.45	89.56	22.26	1.97
BEL	51.84	20.79	47.57	96.17	21.80	2.20
BLC*	64.32	263.99	73.92	327.50	6.84	13.08
BMT	40.30	116.20	34.57	188.75	16.45	1.48
BOU*	40.14	254.76	49.04	319.61	7.36	2.33
BRW	71.30	203.38	70.04	251.24	12.20	8.6
BSL	30.35	270.36	41.33	340.30	6.07	1.78
CBB*	69.12	254.97	77.25	308.85	7.93	∞
CLF	48.23	2.26	43.51	79.43	23.02	1.92
ESK	55.31	356.79	52.71	77.42	23.23	2.73
FCC*	58.76	265.91	68.92	332.25	6.56	7.75
FRD	38.21	282.63	49.14	375.72	5.08	2.35
FUR	48.17	11.28	43.37	86.90	22.45	1.90

Table 1. (continued)

IAGA code	Lat	Long	MLat	MLong	MLT	L-shell
GUI	28.32	343.56	14.39	60.65	0.49	1.07
HON	21.32	202.00	21.40	269.82	11.13	1.16
HRB	47.87	18.19	43.02	92.89	22.02	1.88
IRT	52.17	104.45	47.32	117.25	17.12	2.18
KAK	36.23	140.19	29.25	211.70	15.06	1.32
KNY	31.42	130.88	24.67	202.80	15.58	1.21
LER	60.14	358.81	58.03	81.18	22.96	3.57
LNP	25.00	121.17	18.22	192.92	16.13	1.11
LRV	61.18	338.3	61.80	65.30	0.34	4.48
MEA*	54.62	246.65	62.08	305.70	8.17	4.58
MID	28.21	182.62	24.72	249.95	12.44	1.22
MMB	43.91	144.19	37.08	215.46	14.88	1.58
NAQ	61.18	314.58	66.21	43.40	2.14	6.17
NCK	47.63	16.72	42.71	91.45	22.11	1.86
NEW*	48.27	242.88	54.93	303.27	8.38	3.04
NGK	52.07	12.68	47.95	89.17	22.29	2.24
NUR	60.51	24.66	56.90	102.26	21.39	3.36
OTT	45.40	284.45	55.98	1.05	4.92	3.20
RES*	74.69	265.12	83.51	319.07	7.30	∞
SIT	54.06	135.33	47.95	207.10	15.46	2.24
SOD	67.37	26.63	63.90	101.37	21.05	5.19
SPT	39.55	355.65	32.40	72.02	23.57	1.41

Table 1. (continued)

IAGA code	Lat	Long	MLat	MLong	MLT	L-shell
STJ	47.59	307.32	53.63	31.28	3.02	2.85
SUA	44.68	26.25	39.52	99.53	21.57	1.69
THY	46.90	17.90	41.88	92.32	22.05	1.81
TRO	69.66	18.95	66.63	103.03	21.36	6.38
VAL	51.93	349.75	49.36	70.52	23.78	2.36
VIC	48.52	236.58	53.80	269.12	8.88	2.88
WNG	53.74	9.07	50.01	86.70	22.49	2.43
YKC*	62.48	245.52	69.50	300.48	8.49	8.18

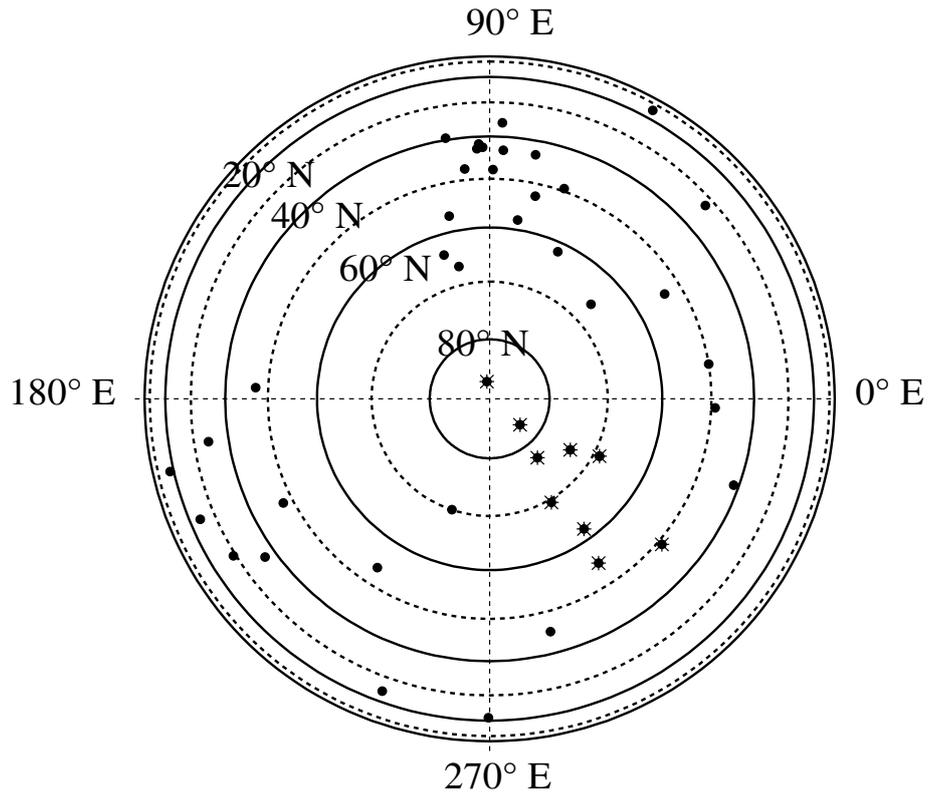


Figure 1. Distribution of the 45 geomagnetic observatories used in the analysis. Magnetic latitude contours are spaced by 10° . Stars indicate the geomagnetic observatories used in Figs. 2, 3 and 4.

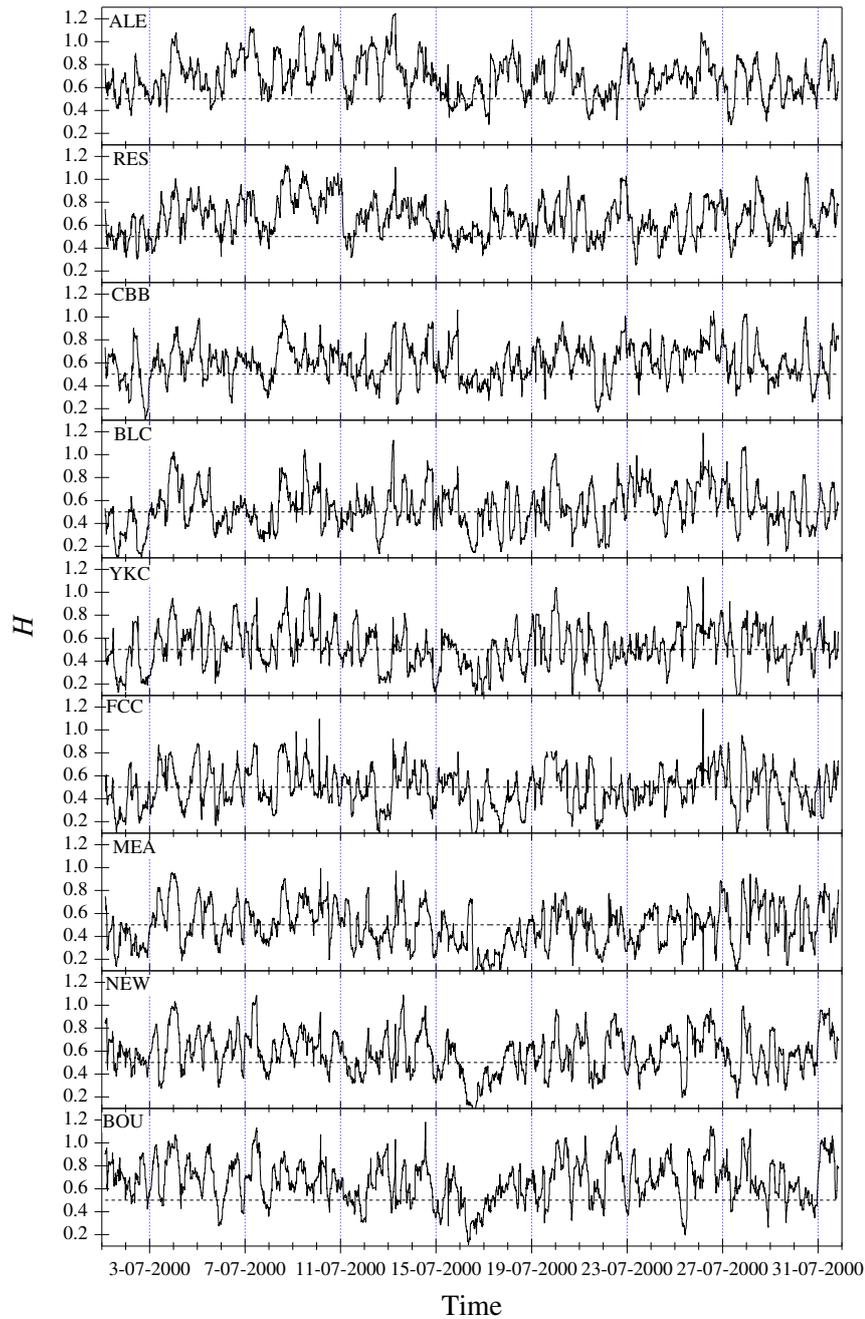


Figure 2. Temporal behaviour of the local Hurst exponent evaluated applying DMA technique on the geomagnetic field horizontal component (with 1 minute time resolution) as collected at nine different observatories during July 2000.

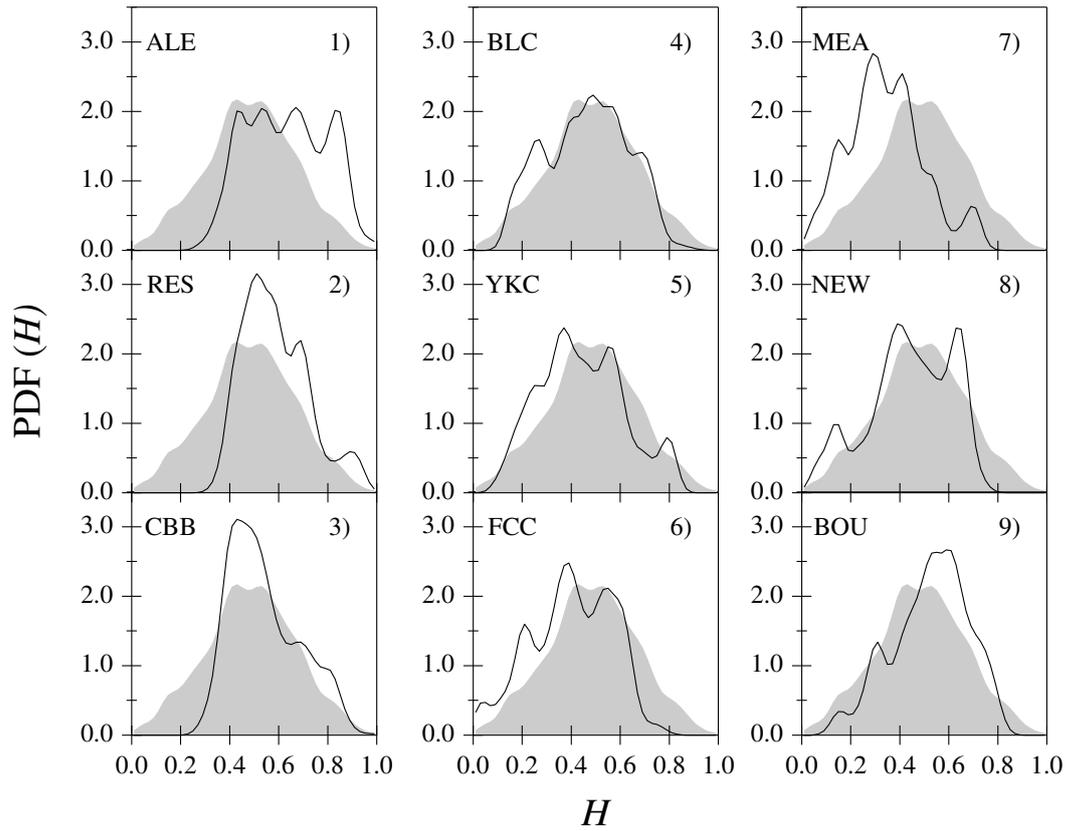


Figure 3. Probability distribution functions (PDFs) of the local Hurst exponent values during the Bastille event (from 15 to 19 July, 2000) at the same nine geomagnetic observatories reported in Fig. 2. The grey PDF in the background is the average one. The plots are reported according to the decreasing value of the geomagnetic observatory latitude (from 1 to 9).

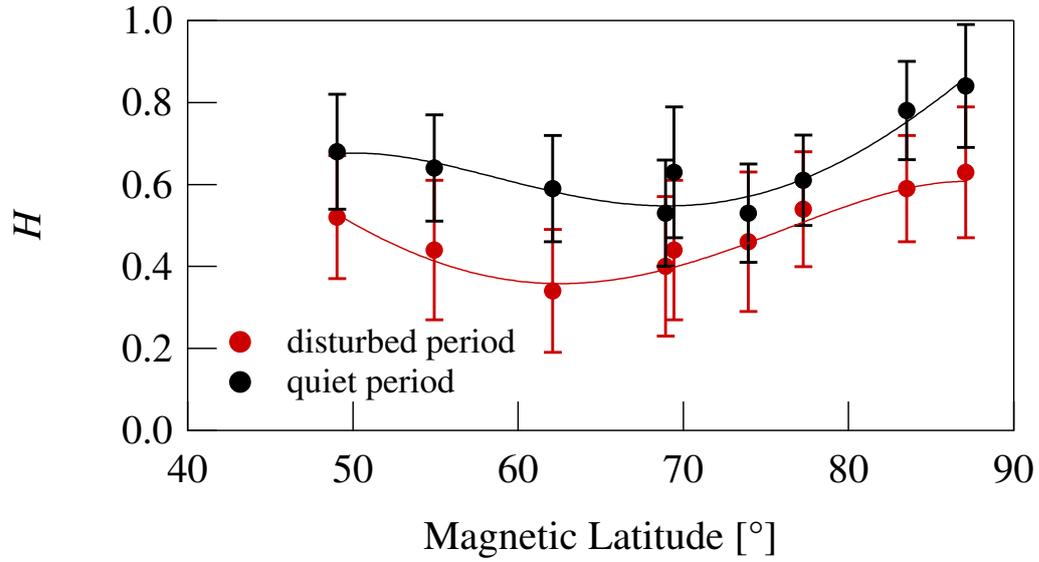


Figure 4. Average values of the local Hurst exponent at the same nine geomagnetic observatories reported in Fig. 2 during both a disturbed period (red markers) and a quiet one (black markers).

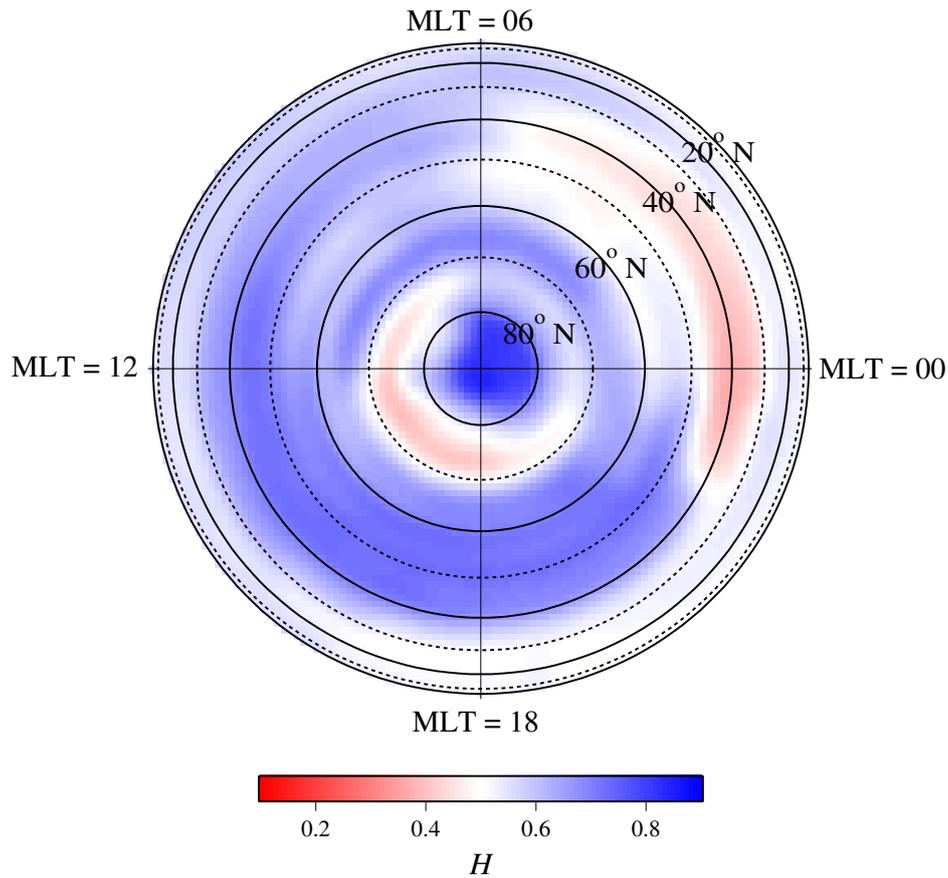


Figure 5. Polar view map of the local Hurst exponent values (H) over the northern hemisphere. The map is relative to July 6, 2000, which is a quiet day. The coordinates are magnetic latitude, from 0° to the North pole, and the magnetic local time (MLT), with local noon at the left side.

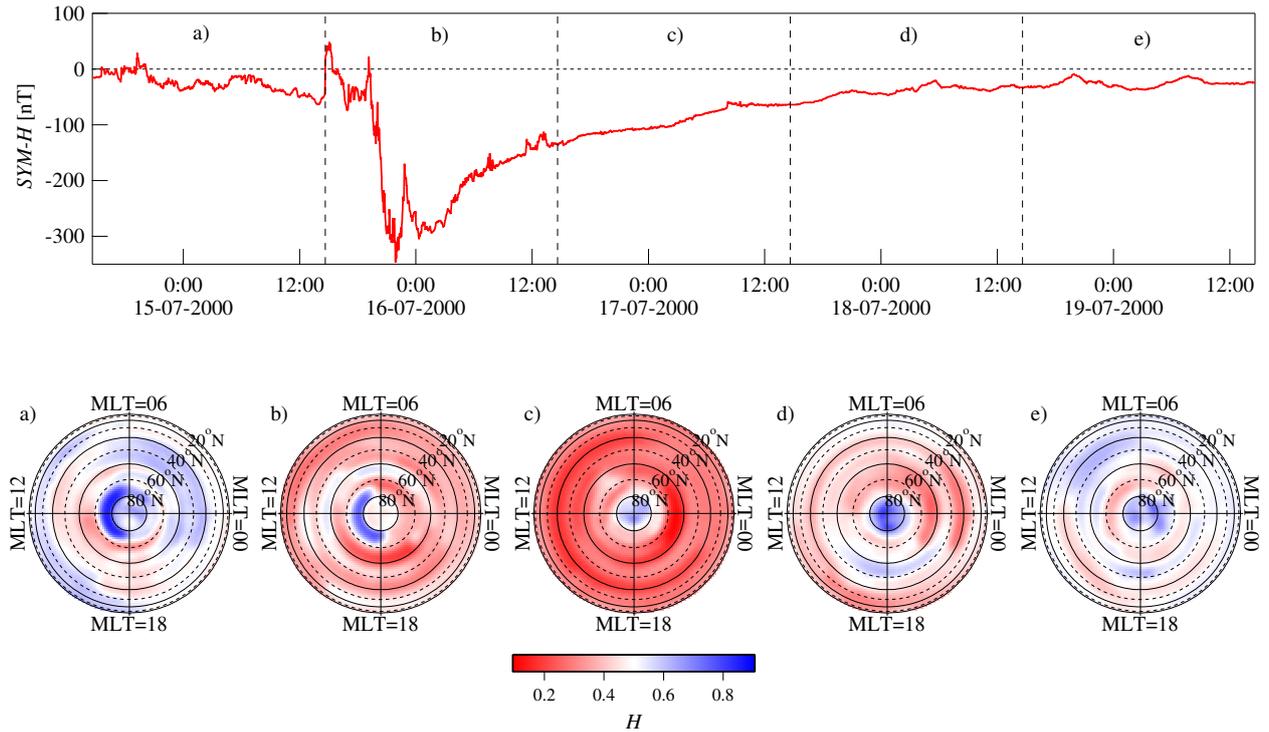


Figure 6. Polar view maps of the local Hurst exponent values (H) during the period characterized by the occurrence of the Bastille event (from 14 to 19 July, 2000) on the northern hemisphere. On the top the $SYM - H$ values for the same period. Each polar map corresponds to a day, which is delimited by a dashed line in the $SYM - H$ plot. The coordinates are magnetic latitude, from 0° to the North pole, and the magnetic local time (MLT), with local noon at the left side.