# Statistical Significance of Minimum of the Order Parameter Fluctuations of Seismicity Before Major Earthquakes in Japan

N. V. Sarlis, E. S. Skordas, S.-R. G. Christopoulos, and P. A. Varotsos

Abstract—In a previous publication, the seismicity of Japan from 1 January 1984 to 11 March 2011 (the time of the M9 Tohoku earthquake occurrence) has been analyzed in a time domain called natural time  $\chi$ . The order parameter of seismicity in this time domain is the variance of  $\chi$  weighted for normalized energy of each earthquake. It was found that the fluctuations of the order parameter of seismicity exhibit 15 distinct minima—deeper than a certain threshold—1 to around 3 months before the occurrence of large earthquakes that occurred in Japan during 1984–2011. Six (out of 15) of these minima were followed by all the shallow earthquakes of magnitude 7.6 or larger during the whole period studied. Here, we show that the probability to achieve the latter result by chance is of the order of  $10^{-5}$ . This conclusion is strengthened by employing also the receiver operating characteristics technique.

**Key words:** Natural time analysis, Japan, receiver operating characteristics, Monte Carlo calculation, fluctuations, order parameter of seismicity.

### 1. Introduction

Earthquakes (EQs) exhibit complex correlations in time, space, and magnitude (Telesca *et al.* 2002; Eichner *et al.* 2007; Huang 2008, 2011; Telesca and Lovallo 2009; Telesca 2010; Lippiello *et al.* 2009, 2012; Lennartz *et al.* 2008, 2011; Sarlis 2011; Rundle *et al.* 2012; Tenenbaum *et al.* 2012; Sarlis and Christopoulos 2012). The EQ scaling laws (Turcotte 1997) point to the view (e.g., Holliday *et al.* 2006) that a mainshock occurrence may be considered an approach to a critical point. Following this view, Varotsos *et al.* (2005) (see also Sarlis *et al.* 2008; Varotsos *et al.* 2011b) suggested that the

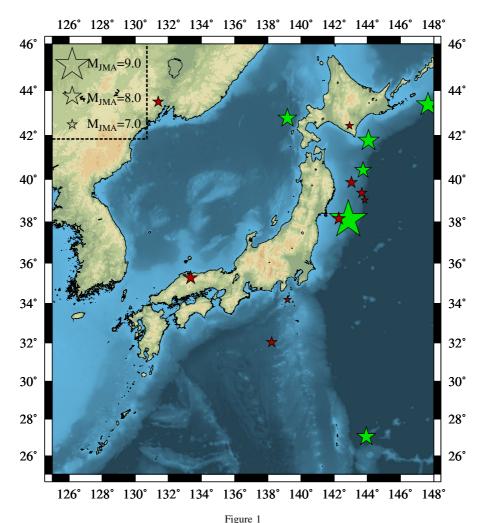
variance  $\kappa_1$  of the natural time  $\chi$  (see Sect. 2) may serve as an order parameter for seismicity.

The study of the fluctuations of this order parameter, denoted  $\beta$  (Sarlis *et al.* 2010), becomes of major importance near the critical point, i.e., near the mainshock occurrence. We assume that a few months represent the period near criticality before each mainshock (Varotsos *et al.* 2011a, 2012a, b, 2013) motivated by the following aspect: the lead time of seismic electric signals (SES) activities that are considered to be emitted when the system enters the critical stage (Varotsos and Alexopoulos 1986; Varotsos *et al.* 1993) ranges from a few weeks to a few months (Varotsos and Lazaridou 1991; Telesca *et al.* 2009, 2010; Varotsos *et al.* 2011b).

Recently, the natural time analysis of seismicity in Japan has been investigated (SARLIS et al. 2013) using the Japan Meteorological Agency (JMA) seismic catalog and considering all the 47,204 EQs of magnitude  $M_{JMA} \ge 3.5$  in the period from 1984 to the time of the M9 Tohoku EQ (i.e., 11 March 2011), within the area 25°-46°N, 125°-148°E depicted in Fig. 1. It was found that the fluctuations of the order parameter of seismicity exhibit 15 distinct minima—deeper than a certain threshold—1 to around 3 months before the occurrence of large earthquakes. Six (out of 15) of these minima were followed by all the shallow earthquakes of magnitude 7.6 or larger during the whole period studied (their epicenters are shown in Fig. 1). Among the minima, the minimum before the M9 Tohoku EQ was the deepest [this EQ was also preceded by a seismic quiescence, as found by HUANG and DING (2012) through an improved region-timelength algorithm]. It is the scope of the present paper to investigate the statistical significance of these results obtained by SARLIS et al. (2013).

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Epicenters (*green stars*) of all shallow EQs with magnitude 7.6 or larger (marked in *bold* in Table 1) within the depicted area N<sub>25</sub><sup>46</sup> E<sub>125</sub><sup>148</sup> since 1 January 1984 until the M9 Tohoku EQ. The *red stars* indicate the epicenters of the smaller EQs listed in Table 1

## 2. Methodology

Natural time analysis has been shown (ABE *et al.* 2005) to extract the maximum information possible from a given time series. For a time series comprising N events, we define the natural time for the occurrence of the kth event of energy  $Q_k$  by  $\chi_k = k/N$  (VAROTSOS *et al.* 2001, 2002). We then study the evolution of the pair  $(\chi_k, p_k)$  where

$$p_k = Q_k / \sum_{n=1}^N Q_n \tag{1}$$

is the normalized energy and construct the quantity  $\kappa_1$  which is the variance of  $\chi$  weighted by  $p_k$ 

$$\kappa_1 = \sum_{k=1}^{N} p_k \chi_k^2 - \left(\sum_{k=1}^{N} p_k \chi_k\right)^2 \equiv \langle \chi^2 \rangle - \langle \chi \rangle^2, \quad (2)$$

where the quantity  $Q_k$ —see Eq. (1)—is estimated by means of the usual relation (Kanamori 1978)

$$O_k \propto 10^{1.5M_k}.\tag{3}$$

(e.g., Varotsos *et al.* 2005, 2011a, 2012a, b, c; Sarlis *et al.* 2010; Ramírez-Rojas and Flores-Márquez 2013; Varotsos *et al.* 2013; Flores-Márquez *et al.* 2014).

The detailed procedure for the computation of  $\beta$  has been described by SARLIS *et al.* (2013). In short, they considered excerpts of the JMA catalog

comprising W consecutive EQs and defined the quantity  $\beta_W \equiv \sigma(\kappa_1)/\mu(\kappa_1)$  as the variability of the order parameter  $\kappa_1 - \mu(\kappa_1)$  and  $\sigma(\kappa_1)$  stand for the average value and the standard deviation of the  $\kappa_1$ values for this excerpt of length W. For such an excerpt, we form its subexcerpts consisting of the nth to (n+5)th EQs, (n=1,2,...W-5) and compute  $\kappa_1$  for each of them by assigning  $\chi_k = k/6$  and  $p_k = Q_k / \sum_{n=1}^{6} Q_n$ , k = 1, 2, ... 6, to the *kth* member of the subexcerpt (since at least l = 6 EQs are needed for obtaining reliable  $\kappa_1$ ). We iterate the same process for new subexcerpts comprising l = 7 members, 8 members, ...and finally W members. Then, we compute the average and the standard deviation of the thus-obtained ensemble of  $\kappa_1$  values [examples of the  $\kappa_1$  values resulted from subexcerpts comprising l = 6, 40, 100, 200, and 300 members (EQs) are given in Fig. 2 for the last  $\approx 10$  year period before the M9 Tohoku EQ]. The  $\beta_W$  value for this excerpt W was assigned to the (W + 1)th EQ in the catalog, the target EQ. Hence, for the  $\beta_W$  value of a target EQ, only its past EQs are used in the calculation. The time evolution of the  $\beta$  value was then pursued by sliding the excerpt W through the EQ catalog. Since  $\approx 10^2$ EQs with  $M_{JMA} \ge 3.5$  occur per month on average, the values W = 200 and W = 300 were chosen, which would cover a period of a few months before each target EQ. As an example, we depict in Fig. 3 the values of  $\beta_{200}$  and  $\beta_{300}$  (red, left scale) along with all  $M_{JMA} \ge 6$  EQs (black, right scale) versus the conventional time during the ≈10-year period before the M9 Tohoku EQ, i.e., since 1 January 2001 until 11 March 2011. The corresponding  $\beta$  values for the remaining period, i.e., since 1 January 1984 until 31 December 2010, can be visualized in SARLIS et al. (2013). Distinct minima of  $\beta_{200}$  and  $\beta_{300}$ —deeper than a certain threshold and having a ratio  $\beta_{300}/\beta_{200}$ close to unity (in the range of 0.95 to 1.08)—have been identified 1-3 months before all shallow EQs with magnitude 7.6 or larger in the period from 1984 to the time of the M9 Tohoku EQ. Especially, the minima of  $\beta_{200}$  precede the EQ occurrence by a lead time  $\Delta t_{200}$  which is at the most 96 days (cf. the entries in bold in the first and the third column of Table 1, see also Table 1 of SARLIS et al. 2013). Moreover, nine additional similar minima have been identified (see Table 2 of SARLIS et al. 2013) during the same period, which were followed by large EQs of smaller magnitude within 3 months. These 15 (=6+9) minima are summarized here in Table 1.

#### 3. Statistical Evaluation by Means of Monte Carlo

The above 15  $\beta$  minima have been identified during the  $\approx$ 27 -year study period comprising

Table 1

The 15 minima of  $\beta_{200}$  that were found (SARLIS et al. 2013) to precede large EQs in Japan during the period 1 January 1984 to 11 March 2011

Date of $\beta_{200}$ minimum	Value of $\beta_{200}$ minimum	EQ date	Lat. (°N)	Long. (°E)	M	$\Delta t_{200}$ (months)
13-10-1986	0.254	14-01-1987	42.45	142.93	6.6	3
08-08-1989	0.278	02-11-1989	39.86	143.05	7.1	3
05-04-1992	0.250	18-07-1992	39.37	143.67	6.9	3
23-05-1993	0.293	12-07-1993	42.78	139.18	7.8	2
1993-07-13	0.188	12-10-1993	32.03	138.24	6.9	3
30-06-1994	0.295	04-10-1994	43.38	147.67	8.2	3
15-10-1994	0.196	28-12-1994	40.43	143.75	7.6	2–3
17-02-1998	0.237	31-05-1998	39.03	143.85	6.4	3
12-04-2000	0.229	01-07-2000	34.19	139.19	6.5	3
09-07-2000	0.243	06-10-2000	35.27	133.35	7.3	3
12-05-2002	0.244	29-06-2002	43.50	131.39	7.0	2
03-07-2003	0.289	26-09-2003	41.78	144.08	8.0	3
11-06-2005	0.286	16-08-2005	38.15	142.28	7.2	2
30-11-2010	0.232	22-12-2010	27.05	143.94	7.8	1
05-01-2011	0.157	11-03-2011	38.10	142.86	9.0	2

The six cases that were followed by all the shallow EQs of magnitude 7.6 or larger are shown in bold

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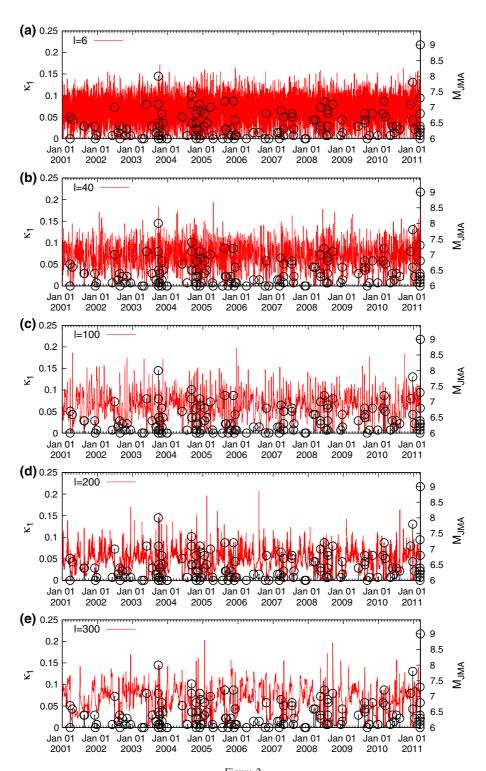
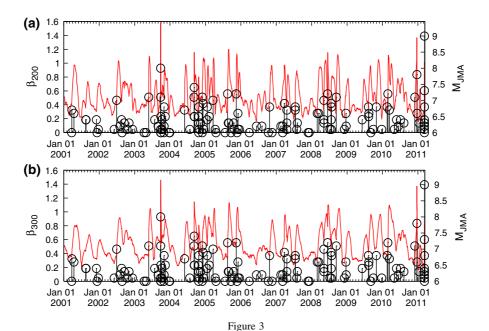


Figure 2
Plots showing how the  $\kappa_1$  values (*left scale*) fluctuate during the last  $\approx$ 10-year period before the M9 Tohoku EQ, i.e., since 1 January 2001 until 11 March 2011. Here, we depict examples of the  $\kappa_1$  values computed from subexcerpts comprising l=6 (**a**), 40 (**b**), 100 (**c**), 200 (**d**), and 300 (**e**) EQs. The EQs with  $M_{IMA} \geq 6$  (*right scale*) are also depicted by the *vertical black lines* ending at *circles* 



Plots of the  $\beta$  values (*left scale*) during the last  $\approx$ 10-year period before the M9 Tohoku EQ, i.e., since 1 January 2001 until 11 March 2011 for W = 200 (**a**) and W = 300 (**b**) along with all  $M_{JMA} \ge 6$  EQs (*right scale*)—*vertical black lines* ending at *circles*—versus the conventional time

9,931 days. The maximum lead time for W = 200was found to be, as mentioned,  $\Delta t_{200} = 96$  days. Since the  $\beta_W$  values are calculated after the occurrence of each of the 47,204 EQs, we can estimate the probability  $p_1$  to obtain by chance a date having a lead time smaller than 97 days before an EQ of magnitude 7.6 or larger by considering the ratio of the EQs that occurred up to 96 days before an EQ of magnitude 7.6 or larger over the total number of the **EOs** This value considered. results  $p_1 = 4.768/47.204 \approx 10.1 \%$ , and hence the probability to obtain at least six such dates when performing 15(=6+9) attempts can be obtained by binomial distribution which leads  $p_{bin} = 0.237 \%$ . Of course, this probability does not correspond to the probability to obtain the results of Sarlis et al. (2013) by chance since the six successful dates may not correspond to different EQs of magnitude 7.6 or larger.

In order to quantify the latter probability, we performed a Monte Carlo calculation in which we generated 10<sup>6</sup> times, 15 uniformly distributed random integers from 1 to 47,204 to select 15 EQs from the JMA catalog, the occurrence dates of which have been compared with the occurrence dates of the six shallow

EQs with magnitude 7.6 or larger in order to examine whether all these six EQs have been preceded by randomly selected EQs with a maximum lead time of 96 days. This Monte Carlo calculation has been run  $10^3$  times and the corresponding probability is  $p_{MC} =$ 0.00436(64)% where the number in parenthesis denotes the standard deviation. Thus, we find that the probability to obtain by chance the results found by Sarlis *et al.* (2013) is of the order of  $10^{-5}$ . We clarify that this probability refers only to the occurrence time of major EOs, while the relevant calculation for an EO prediction method (e.g., the one based on SES, VA-ROTSOS and ALEXOPOULOS 1984a, b; VAROTSOS et al. 1988) should also consider the probabilities to obtain the epicentral area and the magnitude of the impending EQs (VAROTSOS et al. 1996a, b).

## 4. Statistical Evaluation by Means of Receiver Operating Characteristics

A receiver operating characteristics (ROC) graph (FAWCETT 2006) is a technique to depict the quality of binary predictions. It is a plot of the hit rate (or true positive rate) versus the false alarm rate (or false

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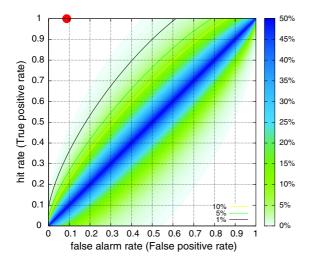


Figure 4 Receiver operating characteristics diagram for P=6 and Q=103 in which the *red circle* corresponds to the results obtained by Sarlis *et al.* (2013). This *circle* is far away from the *blue* diagonal that corresponds to random predictions. The colored contours present the p value to obtain by chance an ROC point based on k-ellipses (Sarlis and Christopoulos 2014); the k-ellipses with  $p=10, 5, {\rm and } 1\%$  are also shown

positive rate), as a function of the total rate of alarms, which is tuned by a threshold in the predictor. The hit rate is the ratio of the cases for which the alarm was on and a significant event occurred over the total number of significant events. The false alarm rate is the ratio of the cases for which the alarm was on and no significant event occurred over the total number of nonsignificant events. Only if the hit rate exceeds the false alarm rate, a predictor is useful [for example, the ROC analysis has been recently used by Telesca et al., (2014) to disciminate between seismograms of tsunamigenic and non-tsunamigenic EQs]. Random predictions generate equal hit and false alarm rate on average (thus, falling on the blue diagonal in Fig. 4 that will be discussed later), and the corresponding ROC curves exhibit fluctuations which depend on the positive *P* cases (i.e., the number of significant events) and the negative O cases (i.e., the number of nonsignificant events) to be predicted. The statistical significance of an ROC curve depends (Mason and Graham 2002) on the area under the curve A in the ROC plane. MASON and GRAHAM (2002) have shown that A = 1 - U/(PQ), where U follows the Mann– Whitney *U* statistics (Mann and Whitney 1947). Very recently, a visualization scheme for the statistical significance of ROC curves has been proposed (Sarlis and Christopoulos 2014). It is based on k-ellipses which are the envelopes of the confidence ellipses—cf. a point lies outside a confidence ellipse with probability  $\exp(-k/2)$ —obtained when using a random predictor and vary the prediction threshold. These k-ellipses cover the whole ROC plane and upon using their A we can have a measure (Sarlis and Christopoulos 2014) of the probability p to obtain by chance (i.e., using a random predictor) an ROC curve passing through each point of the ROC plane.

In the present case, we divide the whole period covering 27 years and almost 3 months into 109 3-month periods (i.e., P + Q = 109) out of which only six included significant events (P = 6). These six significant events were successfully predicted by the aforementioned minima of Table 1 of SARLIS et al. (2013) (written here in bold in Table 1) that preceded all the shallow EQs with magnitude 7.6 or larger during the study period. Hence, the hit rate is 100 %. On the other hand, the nine minima which were followed within 3 months by smaller EQs (see Table 2 of SARLIS et al. 2013 which are not marked in bold in Table 1) may be considered false alarms giving rise to a false alarm rate of  $9/103 \approx 8.74 \%$ . By using the FORTRAN code VISROC. f provided by SARLIS and CHRISTOPOULOS (2014) we obtain: (a) the ROC diagram of Fig. 4 in which we depict by the red circle the operation point that corresponds to the results obtained by SARLIS et al. (2013) and (b) the probability p to obtain this point by chance based on k-ellipses which results in  $p_{ROC} = 0.00314 \%$ . Interestingly, the value of  $p_{ROC}$  is compatible with  $p_{MC}$  estimated in the previous section strengthening the conclusion that the probability to obtain the findings of SARLIS et al. (2013) by chance is of the order of  $10^{-5}$ .

### 5. Conclusions

Recently, the seismicity of Japan was analyzed in natural time from 1 January 1984 to 11 March 2011 using sliding natural time windows of length W comprising the number of events that would occur in a few months. Fifteen distinct minima of the variability  $\beta$  of the order parameter of seismicity were identified 1–3 months before large EQs. Among these

minima, six were followed by the stronger EQs, namely all the six shallow EQs with  $M_{JMA} \ge 7.6$  that occurred in Japan during this  $\approx 27$  year period. The probability to obtain the latter result by chance is of the order of  $10^{-5}$  as shown here using Monte Carlo calculation. The same conclusion is obtained when using the ROC technique.

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