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## Statistical analysis of an ionospheric parameter as a base for earthquake prediction

Mei Li<sup>1,2,3</sup> and Michel Parrot<sup>1</sup>

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[1] This paper is related to the use of ionospheric density variations to tentatively predict earthquakes. The results of this statistical analysis are presented as a function of various parameters. The ion density was recorded by the low-altitude satellite DEMETER during more than 6 years, and a search for anomalies was automatically conducted with the complete data set. In a second time, a software checked if each anomaly could correspond to an earthquake. The search was conducted at less than 1500 km from the anomaly positions, and until 15 days after the anomaly time. The earthquakes have been classified depending on their magnitude, depth, and position (below the sea or inland). This attempt to predict earthquakes of course generates a lot of false alarms and wrong detections. Nevertheless, it is shown that the number of good detections increases with the magnitude of the earthquakes. In average the number of perturbations is higher the day of the earthquake, and then smoothly decreases for the days before. Earthquakes below the sea are better detected. There are seismic areas close to the South Atlantic Magnetic Anomaly and at high latitudes where the number of natural perturbations is too important to expect a high number of good detections. Finally, when there are several perturbations corresponding to a single earthquake, it is possible to combine their positions to have a better estimation of the location of the future epicenter. However, uncertainties about the time and the magnitude are large.

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### 1. Introduction

[2] Satellite experiments due to the vast coverage of the seismic zones of the Earth are especially regarded as suitable means for earthquake (EQ) study. Data recorded by many different satellites have been used in the past to understand the relation between preseismic ionospheric variations and seismic activity (see the review by Parrot [2009]). It was also possible to study the lithosphere-atmosphere-ionosphere coupling using data simultaneously recorded by ground-based experiments. Latest works can be found for example in Liu *et al.* [2009] and Kon *et al.* [2011]. Ionospheric perturbations have been also detected prior to the recent powerful Tohoku EQ in Japan [Ouzounov *et al.*, 2011; Heki, 2011; He *et al.*, 2012; Akhoondzadeh, 2012]. As a result of researches during the last 10 years, it has been shown that the ionosphere is sensitive to the seismic effect although its main behavior is dominated by the solar activity.

[3] This is not the scope of this paper but a number of generation mechanisms have been suggested for the explanation of these precursors. The ionospheric density variations can be induced by change of the current in the global electric circuit between the bottom of the ionosphere and the Earth's surface where electric charges associated with the stressed rocks can appear [Kuo *et al.*, 2011]. Recent hypotheses and modeling can be found for example in monographs [Hayakawa, 2009, 2012], in reviews by Pulinets [2009, 2012], Freund [2011], Pulinets and Ouzounov [2011], and references therein. In recent years, special attention has been drawn to gas release prior to earthquakes [Omori *et al.*, 2007; Pulinets, 2007; Harrison *et al.*, 2010; Baragiola *et al.*, 2011] and atmospheric heating, which can be revealed with infrared experiments onboard satellites [Ouzounov *et al.*, 2007, 2011].

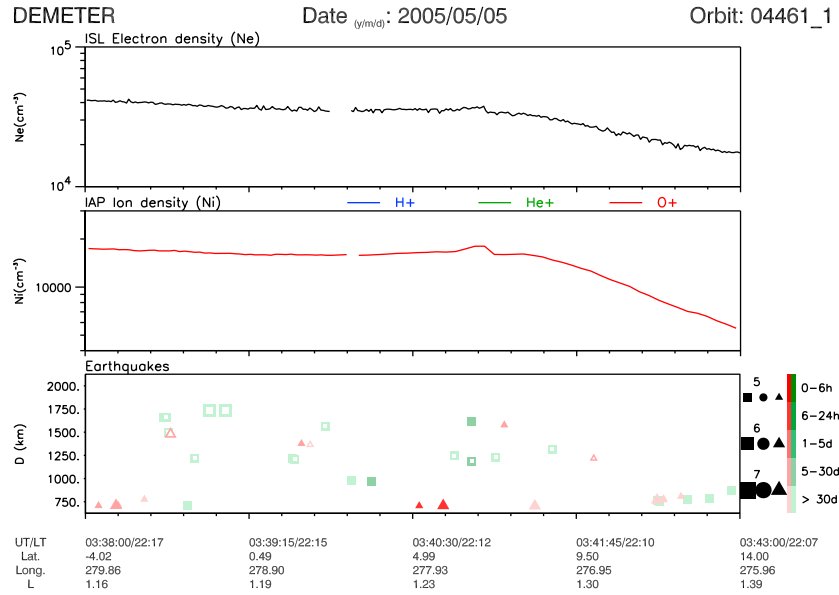
[4] In this paper the total ion density given by the IAP (Instrument Analyseur de Plasma) experiment onboard the DEMETER satellite is used. The DEMETER data are presented in section 2 and, because this paper is an extension of Li and Parrot [2012], the data processing method is only briefly reviewed in section 3. In section 4, new results of the statistical analysis are presented. A comparison with random generated EQs is given in section 5. The spatial-time distribution characteristics of the seismo-ionospheric effect are shown in section 6. To confirm these results, a similar data processing with the electron density is carried out in section 7. Discussion and conclusions are provided in section 8.

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**Figure 1.** Data recorded on 5 May 2005 between 03.38.00 UT and 03.43.00 UT, 16 h before a  $M_w$  6.5 EQ. The top panel represents the electron density and the middle panel is devoted to the ion density. Due to the scale only the density of the  $O^+$  ions is shown because they are the majority. The bottom panel is related to the distance and magnitude of coming earthquakes as function of the time. The red triangles are related to the future main shocks and aftershocks whereas the green symbols are related to past earthquakes (see text for more explanation). The parameters below the plots indicate the position of the satellite along its orbit.

## 2. The Data

[5] DEMETER was a low-altitude satellite launched in June 2004 onto a polar and circular orbit that measures electromagnetic waves and plasma parameters all around the globe except in the auroral zones [Cussac *et al.*, 2006]. Its initial altitude of  $\sim 710$  km was lowered to  $\sim 660$  km at the end of 2005. It was the first satellite that was mainly dedicated to record seismo-electromagnetic effects on the ionosphere. It included six scientific payloads. Each of them offered long-time and continuously high-quality data to allow performing meaningful statistical studies with a much larger number of recorded events in comparison with previous ones [Parrot, 2006].

[6] The experiment IAP gives ion density with a 4 s time resolution and details of this experiment can be found in Berthelier *et al.* [2006]. As DEMETER went to its end in December 2010, it was possible to investigate the relationship between the ionospheric variations of the total ion density (the sum of  $H^+$ ,  $He^+$  and  $O^+$ ) and seismic activities that took place during the satellite's lifetime.

[7] The electron density data used in this paper were recorded by the ISL (Instrument Sonde de Langmuir) experiment onboard the satellite. The time resolution is 1 s. Details about ISL can be found in Lebreton *et al.* [2006].

[8] There have been accumulated reports on the ionospheric precursory effects of EQs observed by DEMETER

during nighttime. A nonexhaustive list includes Parrot *et al.* [2006], Ouyang *et al.* [2008], Zhang *et al.* [2009a, 2009b], Akhondzadeh *et al.* [2010], An *et al.* [2010], Bankov *et al.* [2010], He *et al.* [2010], Sarkar *et al.* [2011], Ouyang *et al.* [2011], and Piša *et al.* [2011]. DEMETER recorded many similar events and another example is given in Figure 1. It corresponds to an EQ occurring on 5 May 2005 at 19:12:21 UT with a magnitude equal to 6.5 and a depth equal to 18 km. Its position was  $5.71^\circ N$ ,  $82.85^\circ W$ . From the top to the bottom, the panels show the electron density, the density of the  $O^+$  ion, and the earthquake occurrences along the satellite orbit (at the DEMETER altitude the  $O^+$  ions are the majority and the  $O^+$  ion density is almost equivalent to the total ion density). The bottom panel indicates the satellite closest approach of past and future EQ epicenters that are within 2000 km from the DEMETER orbit. The  $Y$ -axis represents the distances  $D$  between the epicenters and the satellite, from 750 up to 2000 km. The symbols are filled square for postseismic events, filled triangle for preseismic events. The scale on the right represents the time interval between the EQs and the DEMETER orbit with a graduation from  $>30$  days up to a  $[0-6$  h] interval. The empty symbols have similar significations except that they are related to the magnetically conjugated points of the epicenters (the distance  $D$  is then the distance between these magnetically conjugated points of the epicenters and the satellite). The symbol sizes correspond to EQs of magnitude  $[5-6]$ ,  $[6-7]$ , and  $[>7]$ . At 03:40:45 UT the red triangle indicates the closest approach to the epicenter of this EQ and the other smaller red triangle indicates an aftershock. It can be observed that there is an increase of the electron density and of the  $O^+$  ion density close to this location. Except the correlation in time and in space between the EQ and the perturbation, there is no way to firmly attribute this ionospheric

**Table 1.** EQs Considered in the Present Paper for the Ion Density Data Processing

$4.8 \leq M_w \leq 5.0$	$5.1 \leq M_w \leq 6.0$	$M_w \geq 6.1$
12057	8953	853

**Table 2.** Statistical Results Concerning Seismo-Ionospheric Influences on the ion Density for Different Values of the Perturbation  $A$  ( $D = 0-1500$  km,  $d = 0-1000$  km,  $T = 0-15$  Days)<sup>a</sup>

$M_w$	4.8-5.0			5.1-6.0			≥6.1		
	$Ng$	$Np$	$Nd$	$Ng$	$Np$	$Nd$	$Ng$	$Np$	$Nd$
>0	5385	16,563	1976	4588	16,102	1940	622	3142	371
>5%	4860	12,858	898	4184	12,536	879	579	2503	177
>10%	4285	10,042	510	3741	9,779	469	534	2009	95
>15%	3817	8,061	291	3345	7,816	265	491	1608	51

<sup>a</sup> $Ng$ ,  $Np$ , and  $Nd$  stand for the number of good detections, the number of right alarms, and the number of perturbations with a decreasing trend, respectively.

perturbation to precursory effects of this EQ. Then, many cautions have been taken in the study of particular events (see for example *Piša et al.* [2011]), and statistical analyses of a huge number of events have been conducted. Then, it was shown by *He et al.* [2011] and *Piša et al.* [2012] that, statistically, EQs induce perturbations in the ionosphere. This was also supported by *Parrot* [2012] who used IAP data and compared the number of perturbations in the vicinity (time and space) of known EQs, and the number of perturbations in the vicinity of random events. In the two cases the perturbations were automatically determined by software.

### 3. The Data Processing Method With the Ion Density

[9] In this paper, all ionospheric perturbations (similar to the one shown in Figure 1) are automatically searched in the complete nighttime data set of 6.5 years, and then it is automatically checked if a perturbation could correspond to a given EQ.

[10] First, the complete set of half-orbit IAP ion density data, which includes 96,863 nighttime data files with 27,257,933 data points with the same sampling rate, is considered. This set is used to automatically search perturbations. Only the perturbations that comply with (i) the duration time is between 23 and 120 s, (ii) the distance to the nearest seismic zone is less than or equal to 1500 km (a map of seismic activity zones was constructed using the list of EQs with  $M_w \geq 4.8$  taking place from 1 July 2004 to 31 December 2010), and (iii)  $Kp$  index is less than 3 during the same day where the perturbation appears. This last requirement eliminates the effect of solar activity on the ionosphere, which is considered as one of the main confounding factors. Huge perturbation amplitudes have been also eliminated because they did not have physical meanings and they corresponded to spurious peaks (ion density is also automatically extracted from IAP raw data). Peak values are compared to background values. For example in case of increase, a maximum is first determined. This maximum being at the time  $t$ , a search is conducted for the two minima, which are just around  $t$  (first change of the sign of the derivative on each side of the maximum). If they occur at  $t1$  ( $< t$ ) and  $t2$  ( $> t$ ), the perturbation is kept if  $23 \text{ s} < t2 - t1 < 120 \text{ s}$ , and the background value is determined by values at  $t1$  and  $t2$ . At the end, the perturbation database contains 56,139 events in all. The information for each perturbation includes peak appearing time, orbit number, location (latitude and

longitude), background value, amplitude, change trend (increase or decrease; if the amplitude is larger than the background value, it is increase, if not, it is decrease), and duration time. In the following we will use the parameter  $A$ , which is the ratio between an increase or decrease in amplitude of the perturbations and the corresponding background value. It must be noted that, doing such process, the variation of the ion density is only considered whatever the real values of this ion density are. This will prevent problems that may occur if this ion density is not well determined (wrong absolute values) or if the satellite altitude changes as it is the case (nonhomogeneous data base).

[11] Second, the EQ database considered includes 21,863 EQs from 20 August 2004 to 31 December 2010, with  $M_w \geq 4.8$  (USGS: <http://www.usgs.gov>) and they are classified into three groups in the light of magnitudes  $M_w$  (see Table 1). Table 1 shows that 55.1% of the earthquakes are with  $M_w$  4.8-5.0, 41.0% with  $M_w$  5.1-6.0, and 3.9% with  $M_w$  being larger than or equal to 6.1.

[12] Last, to study the possible influence of the seismic activity on the ionosphere under different conditions,  $D$  is defined as the distance between the location of the perturbation on the orbit and the epicenter of an EQ,  $T$  is the delay time before an EQ in days, and  $d$  is the depth of an EQ. For each perturbation of the list, we need to check if this perturbation could correspond or not to one EQ under the limit conditions mentioned above (selected values of  $D$  and  $T$ ). If an EQ is corresponding to one or to more than one perturbation, we consider it is a good detection; if not, it is a bad detection. If a perturbation corresponds to an EQ, it is a right alarm; if not, it is a false alarm. Preliminary statistical results for different  $D$ ,  $T$ , and  $d$  have been presented in *Li and Parrot* [2012] and in this paper we extend the analysis for different  $A$  and different positions of the EQs.

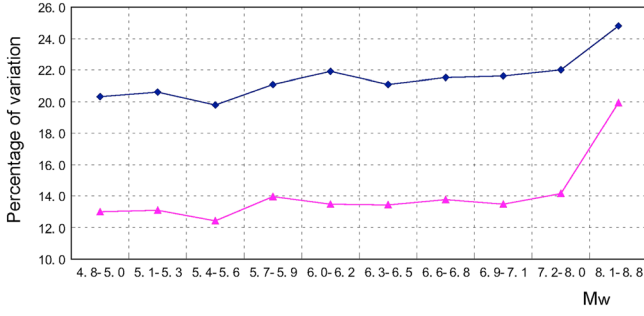
### 4. Results of the Statistical Analysis

[13] The complete results for the parameters,  $D = 0-1500$  km,  $T = 0-15$  days,  $A > 10\%$ , and  $M_w = 4.8-5$  are the following: number of the perturbations input = 56,139, number of perturbations complying with the limits = 26,877, number of right alarms  $Np = 10,042$ , number of false alarms = 16,835, number of EQs complying with the limits = 12,057, number of good detections  $Ng = 4285$ , and number of wrong detections = 7772. The number of right alarms  $Np$  does not match that of good detections  $Ng$  because a given EQ can

**Table 3.** Statistical Results Concerning Seismo-Ionospheric Influences on the ion Density for Different Values of the Perturbation  $A$  ( $D = 0-1500$  km,  $d = 0-1000$  km,  $T = 0-15$  Days)<sup>a</sup>

$M_w$	4.8-5.0			5.1-6.0			≥6.1			FA
	$r$	$n$	$s$	$r$	$n$	$s$	$r$	$n$	$s$	
>0	44.7%	3.1	88.1%	51.2%	3.5	88.0%	72.9%	5.1	88.2%	22.9%
>5%	40.3%	2.7	93.0%	46.7%	3.0	93.0%	67.9%	4.3	92.9%	20.6%
>10%	35.5%	2.3	94.9%	41.8%	2.6	95.2%	62.6%	3.8	95.3%	18.8%
>15%	31.7%	2.1	96.4%	37.4%	2.3	96.6%	57.6%	3.3	96.8%	17.2%

<sup>a</sup>Same as in Table 2 but the main results are expressed in percentage. The parameter  $r$  is the percentage of good detections for earthquakes,  $n$  designates the average number of perturbations for each earthquake detected, and  $s$  is the ratio of the number of right alarms with the trend "increase" and the total number of right alarms. FA is the percentage of false alarms.



**Figure 2.** The blue curve shows the average of the ratio  $A$  as a function of different magnitude ranges of the EQs. Because the distribution of  $A$  is not Gaussian, the red curve shows the median value of  $A$  as a function of different magnitude ranges of the EQs.

induce several perturbations at different times. Concerning the number of false alarms, we must take into account the number of right alarms for EQs with magnitudes larger than 5 in the same conditions (9779 for  $5.1 \leq M_w \leq 6.0$  and 2009 for  $M_w \geq 6.1$ ). It means that the real number of false alarms is 5047. These results are displayed in the third row of Table 2. We use different ranges for the amplitude  $A$  to try to increase the number of good detections and to decrease the number of false alarms. When  $A > 0$  it means that all perturbations are considered, when  $A > 10\%$  it means that we eliminate the small perturbations that have a ratio between the perturbation amplitude and the background amplitude less than 10%. The number of perturbations complying with the limits is 46,446, 35127, 26877, and 21119 for  $A$  larger than 0, 5, 10, and 15%, respectively. All the corresponding results (including the previous ones at the beginning of this section) are shown in Tables 2 and 3. In these results,  $n$  designates the average number of perturbations for each EQ detected,  $r$  is the ratio of the number of detected EQs and that of EQs, which comply with the limit conditions,  $s$  is the ratio of the number of right alarms with the trend “increase” and the total number of right alarms, and FA is the ratio of false alarms.

[14] The results in Tables 2 and 3 indicate that, whatever is the level of perturbations we select, the percentage of good detections is always increasing with the magnitude, i.e., the powerful EQs are better detected. In the same way, the average number of perturbations is also larger for these EQs. When perturbations with low amplitude are eliminated the number of good detections decreases whatever is the magnitude of the EQs, but oppositely the number of false alarms also decreases. Then, there is a tendency to say that the amplitude of the perturbations is not well related to the magnitude of the EQs. To check this, average and median values of  $A$  have been plotted as a function of the magnitude of the detected EQs. The result is shown in Figure 2, and it can be seen that in fact there are larger perturbations for larger EQ magnitudes as expected. This is not well established because it is only evident for very large magnitudes. An explanation is that EQ characteristics other than the magnitude certainly play a role.

[15] It must be also noticed in Table 3 that, when we only keep perturbations with large amplitudes, the perturbations mainly correspond to increase of the density.

[16] Regarding the possible mechanisms of ionospheric perturbations by EQs, it is evident that they must take the EQ locations into account. Then, to check if there is an influence, we have shared the EQ locations in our analysis into three parts: EQs with inland epicenters, EQs with epicenters below the sea with a water depth more than 1 km, and EQs with epicenters close to a coast (depth less than 1 km). The results are shown in Tables 4 and 5. It can be seen that the percentage of good detections increases with the magnitude whatever is the location of the EQs. However, as was already noticed by Parrot [2012], the percentage of good detections is larger for EQs occurring below the sea. Furthermore, EQs taking place near coasts have the lowest percentage of good detections.

## 5. Comparison With Random Generated EQs

[17] To check the validity of the results, a comparison has been carried out with random generated EQs. To obtain random generated events, longitudes of all real EQs have been shifted by  $25^\circ$  to the west, and we have subtracted one month to their times. This was conducted to try to keep the same ionospheric conditions because most of the earthquakes are concentrated around the equator, and it is known that, during nighttime, natural occurrence of ionospheric perturbations is also more concentrated around the equator. The one month shift of time was also to stay at the same season. From this list of new events, 30 sets of  $N$  events have been randomly extracted. The number of events  $N$  was chosen equal to 8000 to be close to the number of real EQs with  $M_w=4.8-5$  or  $M_w=5.1-6$  that we have in Table 1. Then for each of these 30 sets the same data processing as for the real EQs has been used to estimate 30 times the parameter  $r$  (the ratio between the detected events and the total number of events). At the end, the average value of  $r$  for the random selected events is 42.27 and its variance is 0.15. This value is lower than the lower value of  $r$  shown in the first row of Table 3 (44.7% for the EQs with low magnitude).

## 6. The Spatial-Time Distribution Characteristics of the Seismo-Ionospheric Effect

[18] On one hand, while one perturbation could be attributed to a single EQ, we have also found that one EQ can correspond to more than one perturbation. On the other hand, the number of false alarms (perturbation with no EQ) is important because seismic activity is not the unique factor giving rise to ionospheric variations. Therefore, it is necessary to do some statistics about the number of perturbations for each

**Table 4.** Statistical Results Concerning the Seismo-Ionospheric Influences on the ion Density for Different Locations of the Earthquakes ( $D = 0-1500$  km,  $d = 0-1000$  km,  $T = 0-15$  Days,  $A > 0$ )<sup>a</sup>

$M_w$	4.8-5.0				5.1-6.0				$\geq 6.1$			
	$N_e$	$N_g$	$N_p$	$N_d$	$N_e$	$N_g$	$N_p$	$N_d$	$N_e$	$N_g$	$N_p$	$N_d$
Land-Sea												
Sea	3104	1686	6703	851	2535	1654	7741	975	175	149	1016	152
Coast	4931	1889	4957	535	3635	1567	4267	461	382	264	1188	112
Land	4022	1810	4903	583	2783	1367	4094	475	296	209	938	98

<sup>a</sup> $N_e$  is the number of earthquakes to be detected. Same parameters as in Table 2.



**Table 5.** Statistical Results Concerning the Seismo-Ionospheric Influences on the Ion Density for Different Locations of the Earthquakes ( $D = 0-1500$  km,  $d = 0-1000$  km,  $T = 0-15$  Days,  $A > 0$ )<sup>a</sup>

$M_w$	4.8–5.0			5.1–6.0			≥6.1		
	$r$	$n$	$s$	$r$	$n$	$s$	$r$	$n$	$s$
Land-Sea									
Sea	54.3%	4.0	87.3%	65.2%	4.7	87.4%	85.1%	6.8	85.0%
Coast	38.3%	2.6	89.2%	43.1%	2.7	89.2%	69.1%	4.5	90.6%
Land	45.0%	2.7	88.1%	49.1%	3.0	88.4%	70.6%	4.5	89.5%

<sup>a</sup>Same data as in Table 4 but the results are expressed in percentage. Same parameters as in Table 3.

EQ detected. It is natural to classify the 10,595 EQs well detected (Table 2,  $A > 0$ ) into three groups according to the number of their associated perturbations 1–9, 10–19, and more than or equal to 20. The corresponding number of EQs is 10,030 (94.2%), 503 (4.2%), and 62 (0.6%), respectively. Their locations are shown in a global map with different labels (see Figure 3).

[19] From Figure 3, it can be seen that EQs with 1–9 perturbations are in the main global seismic zones, especially plate-boundary interfaces, Circum-Pacific seismic belt, and Chile seismic zone. While there is a little change for the EQs corresponding to 10–19 perturbations, it happens that 62 EQs with more than 19 perturbations lie in the Southern Hemisphere in a very specific area, which is a surprising result. These 62 EQs correspond to 25 EQs with  $4.8 \leq M_w \leq 5.0$ , 31 with  $5.1 \leq M_w \leq 6.0$ , and 6 with  $M_w \geq 6.1$ . The  $M_w$  8.8 Chile EQ that took place on 27 February 2010 is the largest one corresponding to more than 19 perturbations among the six strong EQs in this region. Moreover, it is also the only one with more than 19 perturbations among the 86 EQs with  $M_w > 7.0$  occurring during the mission. Therefore, it means that the number of perturbations has little relationship with the magnitude of strong EQs. To check this problem, two rectangular areas have been selected in Figure 3: one where we observe a large number of perturbations per EQ, Zone1 with  $\text{latmin} = -70^\circ$ ,  $\text{latmax} = -45^\circ$ ,  $\text{longmax} = 150^\circ\text{W}$ ,  $\text{longmin} = 20^\circ\text{W}$ , and another with much less perturbations

**Table 6.** Statistic Concerning Two Different Areas on the Earth's Surface for  $D = 0-1500$  km;  $d = 0-1000$  km,  $T=0-15$  Days<sup>a</sup>

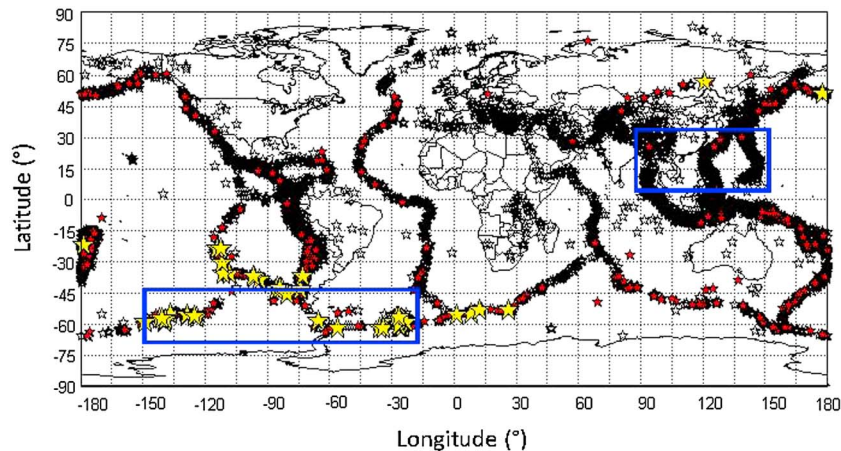
$A$	Zone 1			FA	Zone 2			FA
	$r$	$n$	$s$		$r$	$n$	$s$	
>0	61.9%	5.1	86%	58.6%	14.0%	1.5	87.1%	12.7%
>10%	47.5%	3.6	95.9%	59.1%	10.0%	1.4	95.0%	13.9%

<sup>a</sup>See text for explanations.

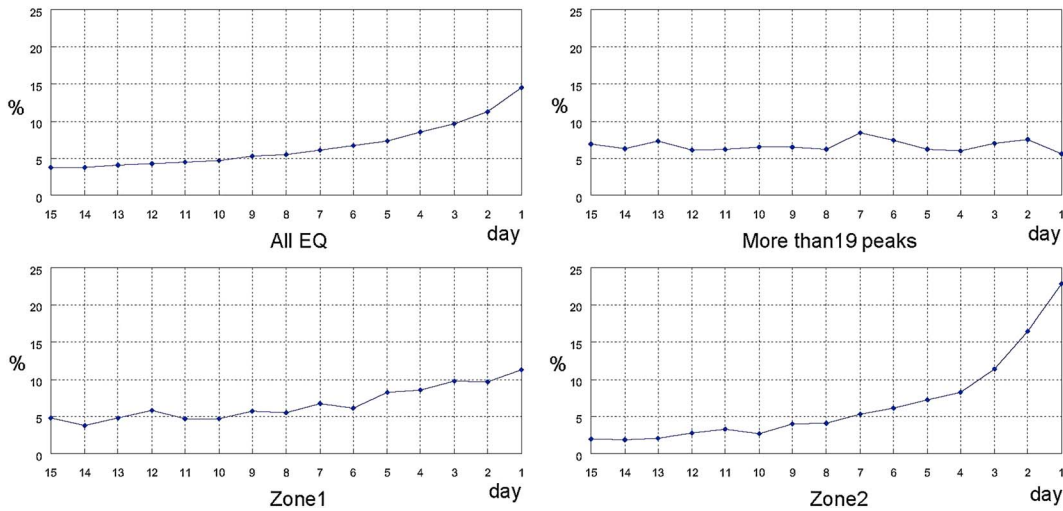
per EQ, Zone2 with  $\text{latmin} = 0^\circ$ ,  $\text{latmax} = 30^\circ$ ,  $\text{longmin} = 90^\circ\text{E}$ ,  $\text{longmax} = 150^\circ\text{E}$ . The corresponding results of the statistics are shown in Table 6. From this table one can see that  $r$ , the number of good detections, is much more important in Zone1. Oppositely, FA, the number of false alarms is much lower in Zone2. This means that the number of perturbations not related to the seismic activity is much more important in Zone1. It allows to artificially detect more EQs, but in compensation the number of false alarms is very high. Additional evidence is revealed when the number of perturbations is checked as a function of time before the EQs.

[20] Figure 4 displays the number of perturbations as a function of days before the EQs for different cases. In each panel the results are expressed as a percentage relative to the total number of perturbations. It can be seen that for the two cases All EQ and Zone2, we obtain a variation that is intuitively expected, i.e., the number of perturbations is maximum for days close to the EQ day and smoothly decreases. In the two cases All EQ and Zone2, 64.3% and 77.6% of the perturbations appear one week before the EQs, respectively. It is not the case for the detected EQs with more than 19 perturbations, which mainly correspond to Zone1. This means that the perturbations have a little relation with seismic activity in this area. A possible reason of this increase of natural ionospheric perturbations is given in the next paragraph.

[21] In the equatorial and low midlatitude ionospheric regions, the distribution of plasma is controlled by the coupled processes of plasma diffusion,  $E \times B$  drifts, thermospheric neutral winds, and chemical processes [Horvath and Lovell, 2009]. The daytime (nighttime)  $F$  region plasma is transported by a vertical upward (downward)  $E \times B$  drift, created by



**Figure 3.** Distribution of all EQs with good detection corresponding to different number of perturbations. The white, red, and yellow stars are related to EQs with 1–9 perturbations, 10–19 perturbations, and more than 19 perturbations, respectively. Zone1 and Zone2 are indicated with blue rectangles (see text for explanation).



**Figure 4.** Variation of the number of perturbations as a function of the days before the EQs and for different cases (top left: all detected EQs, top right: detected EQs with more than 19 perturbations, bottom left: detected EQs in Zone1, bottom right: detected EQs in Zone2).

interaction between the ionospheric  $E$  field and the geomagnetic  $B$  field, over the dip equator, and by field-aligned diffusions on both sides of the dip equator [Hairston *et al.*, 1997; Balan and Bailey, 1995; Balan *et al.*, 1997]. These processes have a tendency to create a plasma distribution symmetric to the dip equator. However, this tendency is interrupted by the meridional and trans-equatorial neutral winds, which move the plasma along the magnetic field lines and produce hemispheric and interhemispheric plasma flows, respectively, and by the accompanying chemical processes [Bailey *et al.*, 1997; Titheridge, 1995; Kil *et al.*, 2006]. Significant longitudinal variations in plasma distribution reflect the corresponding variations of the underlying mechanisms. Major causes of such variations are related to the longitudinal variations in the  $B$  field intensity and declination. Field-aligned hemispheric and interhemispheric plasma flows maximize in regions where the meridional and zonal winds have similar components. Their combination maximizes during southern winter in the  $300^{\circ}\text{E}$ – $340^{\circ}\text{E}$  (geographic) longitude sector, over the Atlantic. There, the declination ( $D$ ) is westerly and high ( $21^{\circ}$ ), and the field-aligned interhemispheric plasma flows are directed from the northern summer to the southern winter hemisphere [Venkatraman and Heelis, 2000]. However, over the South Atlantic, the total  $B$  field intensity is anomalously low  $\sim 22.8 \times 10^3$  nT from Trivedi *et al.* [2005], a phenomenon known as the South Atlantic Magnetic Anomaly (SAMA), that makes the  $E \times B$  drift unusually strong, because its magnitude is  $E \times B/B^2$  [Kendall and Pickering, 1967]. Furthermore, there are special electrodynamic effects in the SAMA region that can further increase the magnitude of the  $E \times B$  drift by increasing the  $E$  field. Because of these plasma dynamics, the plasma density is highly variable over the SAMA and can be anomalously low [Abdu *et al.*, 2005]. Due to energetic particle precipitations, there is an enhanced  $E$  layer ionization

**Table 7.** EQs Considered for the Electron Density Data Processing

$4.8 \leq M_w \leq 5.0$	$5.1 \leq M_w \leq 6.0$	$M_w \geq 6.1$
11686	8616	811

over the SAMA [Abdu and Batista, 1977]. The  $E$  layer conductivity is a maximum, where the magnetic field is a minimum, at the center of the SAMA ( $310^{\circ}\text{E}$ ,  $10^{\circ}\text{S}$  in geographic coordinates), over south Brazil, and decreases with increasing distance away from that center, toward the African continent. This can result in a westward conductivity gradient over the SAMA (indicated as DS by Abdu *et al.* [2003]) that can add to the background conductivity gradient, which is also westward directed during the postsunset hours. Thus, this can create a locally high (or modified) conductivity distribution that is a regular feature of the ionosphere over the SAMA [Abdu *et al.*, 2005]. According to their model simulations, this increased conductivity will create a significantly stronger vertical  $E \times B$  at the prereversal enhancement over Brazil (east coast of South America) than over Jicamarca (west coast of South America). This, combined with the fact that Zone1 is the seismic zone, which is at the highest geomagnetic latitude, make the number of ionospheric perturbations higher than in another seismic region.

## 7. Data Processing With the Electron Density

[22] To confirm the results obtained with the ion density variation, the electron density data from ISL have been processed. Normally, the total ion density and the electron density, which are recorded by the two distinct instruments IAP and ISL, must be equal; however, as said in section 3, it is not always the case and it is the reason why we only consider the relative variation of the densities. Figure 1 is a typ-

**Table 8.** Statistical Results Concerning Seismo-Ionospheric Influences on the Electron Density ( $D = 0$ – $1500$  km,  $d = 0$ – $1000$  km,  $T = 0$ – $15$  Days)<sup>a</sup>

$M_w$	4.8–5.0			5.1–6.0			$\geq 6.1$			
	$A$	$N_g$	$N_p$	$N_d$	$N_g$	$N_p$	$N_d$	$N_g$	$N_p$	$N_d$
$> 0$	3720	9149	1629	3266	8792	1539	488	1602	257	

<sup>a</sup>The parameters are identical to the parameters of Table 2. Results correspond to the first line of Table 2.

**Table 9.** Statistical Results Concerning Seismo-Ionospheric Influences on the Electron Density ( $D = 0\text{--}1500$  km,  $d = 0\text{--}1000$  km,  $T=0\text{--}15$  Days)<sup>a</sup>

$M_w$	4.8–5.0			5.1–6.0			≥6.1			FA
	$r$	$n$	$s$	$r$	$n$	$s$	$r$	$n$	$s$	
>0	31.8%	2.5	82.2%	37.9%	2.7	82.5%	60.2%	3.3	84.0%	27.3%

<sup>a</sup>Same as in Table 8 but the main results are expressed in percentage. The parameters are identical to the parameters of Table 3. Results correspond to the first line of Table 3.

ical example where the ion density is not equal to the electron density although the shape of their variations is identical. For the analysis carried out in this paper the only important point is that they present a maximum at the same time.

[23] The ISL data used here are from 17 November 2004 to 31 December 2010. The seismic activity zones were constructed using the list of EQs with  $M_w \geq 4.8$  taking place from 1 July 2004 to 31 December 2010. The EQs used in the second software are selected from 1 December 2004 to 31 December 2010, with  $M_w \geq 4.8$ , and the number is 21,113. They are classified into three groups as shown in Table 7. The data processing is exactly the same as for the ion density data. The ISL data have been averaged to have a time resolution similar to the IAP data (4 s) and the peak's duration is set to be 20–120 s. The total number of peaks detected is 32,627 and the number of the peaks meeting the limit conditions is 26,874. The results are displayed only for  $A > 0$ , i.e., all perturbations are considered. They are shown in Tables 8 and 9 and they can be compared with the ion density results in Tables 2 and 3. It is observed that:

[24] 1. The results are almost similar in the sense that we observe the same variation, i.e., the percentage of perturbations increases with the EQ magnitude as it was with the ion density.

[25] 2. The average number of perturbations (the parameter  $n$  in the Table 9) also increases with the magnitude.

[26] 3. The only one difference is that the number of detected perturbations is not so large. However, this was expected because the peaks in the electron density are not so sharp than the peaks in the ion density (then the number of detected peaks is not so important). This can be observed in Figure 1 and in the numerous events that were published before in relation with the seismic activity (see section 2).

[27] 4. Another point to mention is that the percentage of the perturbations with decrease of the electron density is a little bit lower than that of the ion density, which may be related to the fact that the determination of the ion density sometimes does not fit with the values of the electron density.

## 8. Discussion and Conclusions

[28] This study deals with EQ prediction but in fact it could not be used as a real prediction because the uncertainty about the time is large (15 days), the uncertainty about the location is also important (within 1500 km), and the magnitude is not precisely known. However, we have shown that

[29] 1. The percentage of good detections of EQs always increases with the magnitude (this is independently shown either with the ion density or with the electron density). This percentage is lower if the same data processing is applied to random generated events.

[30] 2. On average, the amplitude of the perturbations is related to the magnitude of the EQs.

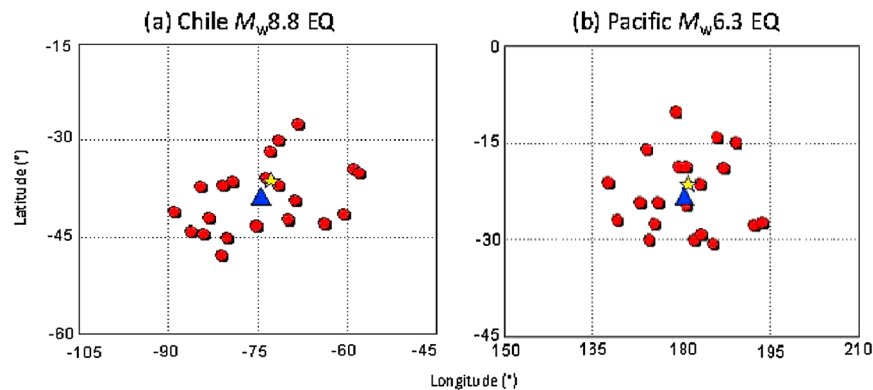
[31] 3. On average, the number of perturbations is higher the day of the EQ and then gradually decreases for the days before.

[32] 4. There are seismic areas on the Earth's surface where it will not be possible to use ionospheric parameters for EQ prediction because the number of natural ionospheric perturbations is too large.

[33] 5. EQs occurring below the sea are better detected.

[34] The obtained results are not very good because not all ionospheric perturbations are caused by EQs and the number of false alarms is large. These ionospheric perturbations may be due to other sources, such as solar activity, acoustic gravity waves, travelling ionospheric disturbances, plasma dynamics as explained in section 6, and large meteorological phenomena. It is shown that the number of false alarms can decrease if small perturbations are eliminated, but on the contrary the number of good detections also decreases, which is not really to be desired.

[35] The number of wrong detections is also important and can be explained by the fact that the satellite is above a seismic area only a few minutes per day, and that we do not expect continuous perturbations from a given EQ. Thus, possible perturbations could be missed. It is feasible to reduce this number of wrong detections if several satellites are



**Figure 5.** (a)  $M_w$  8.8 Chile EQ in 2010; (b)  $M_w$  6.3 Pacific EQ. The real positions of the EQ epicenters are indicated by a yellow star. The blue triangles show the positions of the EQ epicenters automatically determined from the positions of the ionospheric perturbations indicated by red stars (see text for explanation).



simultaneously used. In the future the ESA (European Space Agency) SWARM mission will have three satellites in the ionosphere, and in China they have a project of several satellites devoted to this topic [Shen *et al.*, 2011].

[36] From a perturbation at a given location, a search for an EQ has been automatically carried out within 1500 km of this point. Then the determination of the EQ epicenter is not accurate, but it can be improved if we consider EQs that are well detected several times. It is possible to use the various locations of the perturbations attributed to a given EQ to have a better estimation of the epicenter position. As an example this was carried out in the cases of the  $M_w$  8.8 Chile EQ that occurred in 2010 [see also Piša *et al.*, 2011] and the  $M_w$  6.3 Pacific EQ that occurred on 19 November 2007. The results are shown in Figure 5, which displays the positions of the perturbations, the position of the epicenter, and the point that is at a minimum distance from all the perturbations. It appears that this point (the blue triangle) is at (74.5°W, 38.7°S) not so far from the real epicenter (the yellow star), which is at (72.9°W, 36.1°S) for the  $M_w$  8.8 Chile EQ (Figure 5a). A similar result is also obtained for the Pacific  $M_w$  6.3 EQ (Figure 5b) showing that the predicted point (the blue triangle) at (179.4°W, 23.2°S) is near the real epicenter (the yellow star) at (178.8°W, 21.2°S). It means that when a cluster of perturbations appears in the ionospheric data set in a given area during a few days, it is possible to approximately locate some events.

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