



## RESEARCH ARTICLE

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# Worst-Case Severe Environments for Surface Charging Observed at LANL Satellites as Dependent on Solar Wind and Geomagnetic Conditions

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### Key Points:

- Presence, not magnitude, of substorm activity (as Auroral Electrojet/Auroral Lower index) is the strongest characteristics for severe environments for surface charging
- Occurrence of even a moderate storm is not necessary for severe environments for surface charging to occur
- Solar wind velocity and its magnitude are the direct indicator for the highest risk of severe environments for surface charging

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**Abstract** The 400 worst-case severe environments for surface charging detected at Los Alamos National Laboratory satellites during the years of 1990–2005 as binned by the definitions of four criteria developed by Matéo-Vélez et al. (2018, <https://doi.org/10.1002/2017sw001689>) and the solar wind and Interplanetary Magnetic Field (IMF) parameters and geomagnetic activity indices are analyzed. The conducted analysis shows that only Auroral Electrojet/Auroral Lower index determines the highest risk for severe environments for surface charging to happen. The presence of a substorm with the southward turning pattern in IMF  $B_z$  indicates that the environment can be severe for surface charging to occur but this environment will not depend on whether a substorm was moderate or intense. No clear dependence on IMF  $B_z$  is found for risk to a severe environment to occur. Appearances of severe environments for surface charging do not necessarily require high values of  $Kp$  (Planetarische Kennziffer) and no storm is needed for such an event to be detected. Among solar wind parameters, solar wind velocity  $V_{sw}$  is directly related to the highest risk of severe environments, dependent on the  $V_{sw}$  value; and number density  $N_{sw}$  is of no importance. Two criteria for severe environment events based on the enhancements of low energy particle fluxes exhibit clearer dependencies on the solar wind and IMF parameters and geomagnetic activity indices with more distinct patterns in their time history.

**Plain Language Summary** In spite of recent engineering and technological advancements, modern satellites are still subject to dangerous influence from radiation due to the presence of high energy particles in the near-Earth space. These particles can cause accumulation of some charge on the satellite's surfaces. They vary a lot depending on the activity on the Sun. The solar activity can be characterized by several parameters. Relating the detected surface charging events to the parameters can help to predict the occurrence of these events based on knowing the solar activity. The 400 worst-case severe environments for surface charging detected at Los Alamos National Laboratory satellites during the years of 1990–2005 were analyzed and related to solar activity. It was found that surface charging can occur during rather moderately disturbed conditions, and presence of a strong disturbance does not necessarily lead to satellite anomalies. Solar wind velocity and its magnitude can be a direct indicator for the highest risk of severe environments for surface charging.

## 1. Introduction

In spite of recent engineering and technological advancements since previous analyses of spacecraft anomalies (e.g., Koons et al., 1999; Vampola, 1994), modern satellites are still subject to environmental effects (e.g., Green et al., 2017). Spacecraft charging causes the most spacecraft anomalies related to the radiation environment (e.g., Lam et al., 2012; Loto'aniu et al., 2015), and it is surface charging in particular that has caused more serious ones (e.g., Choi et al., 2011; Koons et al., 2000; Matéo-Vélez et al., 2018).

Surface charging is due to low energy plasma and photoelectric currents (for details, see the reviews by, e.g., Garrett, 1981; Mikaelian, 2001; Whipple, 1981). The spacecraft surface potential is a function of the net current to/from the spacecraft surface. The net current consists of currents from (a) photoelectrons from the surface induced by solar photons, (b) electrons and ions of surrounding plasma impinging on the surface, and (c) charged particles emitted from the satellite (e.g., from electron emission induced by primary electrons, from active ion emission). In a balance, a net current is equal to zero. A spacecraft submerged into

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plasma will assume a floating potential different from the plasma itself. The net current between the surfaces and the plasma will tend to become zero; therefore, the satellite's surface materials will be charged oppositely to the surrounding plasma. The shadowed areas are charged negative. The sunlit areas are charged positive unless some negative barrier of potential (also given by absolute spacecraft potential) imposed by other satellite's surfaces prevent photoelectron to reach the plasma. Even in this case, however, sunlit surfaces remain less negative than other surfaces. For the conducting surfaces, the potential of the surface is uniform for reaching the equilibrium for zero net current. For insulating materials, this equilibrium can only be on several points on the surface. Surface materials can discharge both into space and/or to structure ground. The resulting electrostatic discharge (ESD), with conducted currents and/or radiated waves, can couple into electronic circuits and subsystems, causing damage. Spacecraft charging is a function of the space environment characteristics, including sunlight/eclipse, solar activity, geomagnetic activity, electron and ion flux magnitude, and spectrum.

The electron temperature is considered the most reliable space environment parameter to predict spacecraft charging based on observational (Lai & Della-Rose, 2001; Lai & Tautz, 2006; Rubin et al., 1980) and theoretical (Hastings & Garrett, 1996; Lai et al., 1983) evidence. The spacecraft potential and electron temperature curves show an intercept at a finite temperature. When temperature is below this critical value, spacecraft charging does not occur, and it starts only with temperature above it.

Olsen (1983) demonstrated the existence of a threshold energy of 10 keV of particle fluxes for the SCATHA (Spacecraft Charging At High Altitudes) spacecraft to charge when a large portion of the ambient electron flux exceeds this energy. A later study by Thomsen et al. (2013) for LANL (Los Alamos National Laboratory) MPA (Magnetospheric Plasma Analyzer) data showed that surface charging will occur when a critical threshold of electron fluxes with energies of 8 keV has been satisfied. Sarno-Smith et al. (2016) analyzed the relationships between 30 eV and 50 keV electron fluxes and spacecraft potential using Van Allen Probes Helium Oxygen Proton Electron and Electric Field and Waves data. They found the electron energy flux threshold for 3 keV electrons for intense charging more likely to occur; however, they stated that it is not always the case. In addition, the electron pressure, not the average electron temperature, was shown to have stronger connection to spacecraft charging; but, again, this correlation was not always present. In the studies mentioned above, the spacecraft potential was obtained from observations of the "ion line" (e.g., Thomsen et al., 2013) which represents a sharp low-energy cutoff due to the acceleration of ambient ions through the spacecraft potential.

Correlation between spacecraft anomalies and substorm activity was observed in the 1970s on the Applications Technology Satellite (ATS-5 and ATS-6) and the first two Defense Satellite Communication System-Phase II geosynchronous communication satellites using magnetometer data from ground stations near the satellite magnetic footprint (Fredricks & Scarf, 1973; Rosen et al., 1972). DeForest (1972) directly demonstrated that the surface of the ATS-5 spacecraft was charged to large negative potentials (up to  $-9$  kV under eclipse conditions), when the spacecraft was in the local morning sector, by  $\sim 1$ – $10$  keV electrons injected from the plasma sheet during substorm-associated events. Farthing et al. (1982) analyzed the ground magnetograms from Anchorage station in Alaska and found that the substorm activity occurred very closely in time with the anomalies detected at GOES (Geostationary Operational Environmental Satellite) 4 and 5 in the postmidnight sector. Extended analysis of data from ATS-6, Geodetic Earth Orbiting Satellite-2, and SCATHA resulted in the design guidelines (Purvis et al., 1984) for mitigation of the differential charging hazard. Spence et al. (1993) investigated about 100 anomalies that occurred at several high-inclination, high-altitude satellites by comparing their distribution to the known surface charging distributions (i.e., observed an SCATHA spacecraft) and related them to 10–15 keV energetic particle injections from the Earth's magnetotail during substorms.

The satellite anomalies caused by substorm injection depend on local time indicating that they were caused by geomagnetic activity but not by operational or design problems. Numerous studies (e.g., Allen, 2010; Choi et al., 2011; Fennell et al., 2001; Gubby & Evans, 2002; Iucci et al., 2006; Koons & Gorney, 1991; Lanzerotti et al., 1998; Mazur et al., 2012; O'Brien, 2009; Spence et al., 1993) showed that surface discharges peak at around midnight to dawn in local time with very few occurring on the dayside. That is, the anomalies are the most frequent in the sector of substorm electron injections. For example, Fennell et al. (2001) have analyzed the occurrences of anomalies on HEO (Highly Elliptical Orbit) satellites (Spence et al., 1993)

and found that the spatial distribution of the HEO anomalies mapped to the equatorial plane is close to the pattern of substorm-injected electrons. On the contrary, the effects of internal charging should be most prominent on the dayside or should show no local time dependence at all (Mazur & O'Brien, 2012).

At the same time, it is not possible to state that all substorms and, especially, intense ones, will definitely lead to satellite anomalies and that they will be due to surface charging. Small, isolated substorms can be related to the significant changes in the radiation environment, which could lead to the surface charging related anomalies (e.g., Grafodatskiy et al., 1987; Matéo-Vélez et al., 2016). Matéo-Vélez et al. (2018) have examined the particle data from the LANL spacecraft and extracted times when the particle environment can be extreme and can result in surface charging conditions. It was shown (see Figure 8 in Matéo-Vélez et al., 2018) that severe conditions can occur during geomagnetic storms or isolated substorms but the occurrence even of a moderate storm is not necessary. All the identified times (400 of them) with severe particle environments were attributed with the values of Dst (Disturbance storm time) and AE (Auroral Electrojet) indices. Storms were identified by corresponding Dst variations seen as the initial, main, and recovery phases but not by the strength of them. Isolated moderate substorms were defined by the AE index from 300 to 800 nT, isolated intense substorms—by AE-index higher than 800 nT, and small substorms with AE < 300 nT. Many of the identified events in Matéo-Vélez et al. (2018) were detected during small to moderate substorm activity, and no direct dependence was found on substorm strength. Most events in the Matéo-Vélez et al. (2018) study were observed in the 21–06 MLT (Magnetic Local Time) sector with very few in the <20 MLT or >07 MLT sectors, which is consistent with previous studies (e.g., Mullen et al., 1986).

Among multiple characteristics of geomagnetic activity, the  $K_p$  (Planetarische Kennziffer) index has been considered as the main geomagnetic index in the studies relating satellite anomalies with geomagnetic activity in early studies. Rubin and Garrett (1979) discovered the relation of ATS-5 and ATS-6 potential with  $K_p$ . Farthing et al. (1982) presented the correlation of the anomalies at GOES 4 and 5 spacecraft with the  $K_p$ . The positive correlation between the SCATHA satellite surface potential monitors data and the  $K_p$  index was demonstrated by Mullen et al. (1986) and Koons and Gorney (1991). Later, Spence et al. (1993) analyzed about 100 anomalies detected at several high-inclination, high-altitude satellites and found that the anomaly occurrence is strongly related to the  $K_p$  index value. Choi et al. (2011) selected 95 anomalies that occurred at geostationary satellites from 1997 to 2009 and showed the anomaly occurrence rate increased with increase of the  $K_p$  index. Thomsen et al. (2013) found “an enhanced surface charging probability” at LANL satellites during higher  $K_p$  values. At the same time, the anomalies included the effects from both surface and internal discharges, which have similar dependence on the  $K_p$  index (Koons & Gorney, 1991).

However, no agreement was reached on a linear dependence between the anomalies which might be due to surface charging and the  $K_p$  value. While O'Brien (2009) stated that anomalies due to surface charging are most probable at  $K_p$  of 4–6, Denton and Borovsky (2012) found > 500 V spacecraft potentials occurring at relatively low  $K_p$  values of 2 or 3. O'Brien (2009) used the data of surface charge monitors (Koons et al., 2006; Ozkul et al., 2001) on geosynchronous satellites. Denton and Borovsky (2012) derived spacecraft potentials from the LANL particle data.

Lohmeyer and Cahoy (2013) analyzed 26 solid-state power amplifier anomalies detected at eight Inmarsat geostationary communications satellites during 1996–2012 and found that 80% of anomalies occurred with  $K_p < 3$ . Mazur et al. (2012) have analyzed statistics on surface charging signatures from a charging plate analyzer (CPA) observed on the Intelsat satellites (Koons et al., 2006) at GEO during 1997–2001. Charging potentials from CPA were more straightforward indication of surface charging than obtaining a more complex charging signature from ion spectrograms (as was done in Thomsen et al., 2013). Mazur et al. (2012) noticed that surface charging occurred during both quiet and active time intervals as seen in  $K_p$  index. Moreover, they found the influence from the Russell-McPherron effect (Russell & McPherron, 1973) with semiannual variations in the charging signatures, such as, together with  $K_p$ , the surface charging was more likely to happen during the spring and fall equinoxes (similar to the Matéo-Vélez et al., 2018 study).

Bodeau (2015) questioned the usage of the  $K_p$  index as an indicator for severe environments to cause surface charging and to induce anomalies due to it. A series of solar array string failures occurred on three high-power communication satellites (Hoerber et al., 1998) were compared with the  $K_p$  index and no dependence was found. The conclusion was that “a high  $K_p$  does not insure significant charging levels, and

conversely, significant charging can occur during modest to severe  $Kp$  index values.” Bodeau (2015) examined ground magnetograms and X-ray emissions measured by the Polar spacecraft from the atmosphere in the auroral region near the magnetic footprint of the communication satellites and found that severe substorm activity was detected right before nearly every moment of circuit failure.

Ferguson et al. (2015), while admitting that  $Kp$  dependence for surface charging seems to be logical, since  $Kp$  is an indicator of a disturbed magnetosphere, did not find any correlation trend between the LANL-negative spacecraft potential and the large  $Kp$  values from 7 to 9 (see their Figure 38). They presented the electron flux above a minimum energy  $E_{min}$  as a charging index for geosynchronous spacecraft in sunlight with  $E_{min}$  of 9–15 keV and the threshold for flux above  $E_{min}$  to be near  $4 \times 10^8 e^-/cm^2s$ . The proposed observational charging index was later found to be consistent with the theory in the Huang et al. (2017) study.

While the  $Kp$  index has been extensively used in attempts to find correlations with surface charging anomalies, other characteristics, such as, the AE and Dst indices and solar wind and interplanetary magnetic field (IMF) parameters, were not. Wrenn and Smith (1996) estimated the probability of surface ESD effects on the MARECS-A satellite launched in 1981 at GEO as dependent on  $Kp$  and AE indices. They found that the probability to observe the effects from surface ESD increases for  $Kp$  from 3 to 5 and AE from 200 to 800 nT but decreases for higher magnitudes of  $Kp$  and AE. This behavior was attributed to the magnetic field at GEO being drastically distorted. Lohmeyer et al. (2012) attempted to relate the Inmarsat anomalies with the Dst index and the solar wind speed and found that at the times of the anomalies, the Dst index did not drop below  $-40$  nT and the solar wind speed varied in the range between 300 and 500 km/s exceeding 600 km/s at only two times (see their Figure 14). The importance of the solar wind speed increase for spacecraft potential was reported in earlier studies (DeForest, 1972; Hastings & Garrett, 1996). Denton and Borovsky (2012) investigated spacecraft potentials at LANL during strong and weak High Speed Streams (HSSs). They defined strong events when the solar wind speed is higher than 500 km/s during 5 days but weak events are characterized by the solar wind speed below 400 km/s during 3 days. Denton and Borovsky (2012) found a strong correlation between the average negative spacecraft potential and the solar wind speed. Moreover, the level of the corresponding surface charging was found to be significantly larger for the strong HSSs than for the weak HSSs.

In the present study, we analyze a database of 400 events developed by Matéo-Vélez et al. (2018) (presented in Section 2) which contains the dates and times of the worst-case severe environments for surface charging as observed by LANL satellites during the years of 1990–2005. The main focus is to find possible relations between the activity parameters and worst-case severe environments for surface charging. Each input in the database was attributed with the corresponding values of geomagnetic activity indices and solar wind and IMF parameters. The dependencies of worst-case severe environments for surface charging and near-simultaneous geomagnetic activity are contained in Section 3. It shows peaks in the number of events with corresponding parameter magnitude and range, the highest risk to detect a worst-case severe environment event at the corresponding value of the parameter, and presence of a risk-parameter dependence. Section 4 demonstrates the results of a superimposed epoch analysis with the parameter changes in time before the event, relative timing of parameter maximum change and the event detection time moment, and parameter changes after the event. The obtained dependencies are discussed, and the conclusions are drawn in Section 5.

## 2. Severe Environment Events From LANL Data

We use the database of 400 total events developed by Matéo-Vélez et al. (2018) that contains the dates and times of the worst-case severe environments for surface charging as observed by LANL satellites during the years of 1990–2005. Matéo-Vélez et al. (2018) have analyzed the particle fluxes from the MPA with energies from 100 eV to 40 keV (Bame et al., 1993), the Synchronous Orbit Particle Analyzer with energies between 50 keV and 1.3 MeV (Belian et al., 1992) and the Energetic Spectra for Particles with energies from 1 to several MeV (Meier et al., 1996). Matéo-Vélez et al. (2018) have formulated four different criteria to define severe environments potentially leading to surface charging. A total of 100 worst case events were identified in each criterion with 400 events in total. For a given criterion, each event is among the top 100, 15-min-averaged worst-case severe environments for surface charging defined by that criterion. These four groups

of events comprise the main data set of our study. They also form the basis of on-ground tests of materials under multienergetic electron beams (Matéo-Vélez et al., 2019).

Among the four criteria, one criterion is based on the measured spacecraft potential and three criteria are based on integral electron fluxes. The spacecraft potential criterion deals with the average spectra related to large negative potentials over long periods of time. It was called PG5k, since the longest events with a potential of greater than 5 kV (in absolute) were considered. The criterion defines 100 longest events with potential greater than 5 kV (in absolute). It should be stressed that the top 100 events are selected on the basis of duration of the potential drop rather than the potential drop peak value. This means that the events with stronger charging but having shorter duration are dismissed by this criterion. On the other hand, the threshold values of  $-5$  kV used for the event definition obviously represents extreme charging.

Eclipse or sunlit conditions play a very important role in PG5k criterion. Photoemission is generally the most important charging current, which is able to counterbalance a large fraction of the negative current imposed by electron fluxes during substorms, depending on the incidence angle of photons on the satellite's surfaces. In the present study, 87 out of the 100 PG5k worst-cases are in eclipse. Therefore, it can be considered that PG5k worst-case environments are representative of the most severe charging events occurring during eclipse. The dependence of these events on plasma and geomagnetic conditions is very interesting issue because they are less subject to the uncertainties linked to the sunlight incidence on satellite surfaces.

For criteria based on fluxes, the electron fluxes have been averaged over 15 min, since it is necessary for severe conditions to be present for a few minutes for differential charging to occur at geosynchronous orbit. Matéo-Vélez et al. (2018) used 15 min as an approximate duration to bring significant differential charging (hundreds of volts) on dielectrics of about 25–100  $\mu\text{m}$  thickness in a GEO-like environment.

One criterion concerns high fluxes at low energies together with a Low Flux at High Energy (LFHE). It is a combination of both high fluxes below 50 keV and low fluxes above 200 keV, which is related to surface charging. Another criterion concerns the Highest Fluxes at All Energies (HFAE). It combines high fluxes both below 50 keV and above 200 keV, since they are related to charge deposited both at the surface and in the bulk of covering insulators. The last criterion is about the highest fluxes of electrons at energies above 10 keV (FE10k). The most severe electron spectrum was selected each month on each spacecraft to avoid duplication if the same events were detected by several spacecraft. The list of most severe satellite-month spectra was then classified within top 100 events, one for each criterion, resulting in 400 events in total. A potential below  $-300$  V was reached for 80 FE10k worst-case events out of 100, 60 for HFAE, and 40 for LFHE. It should be stressed here that the worst-case environments criteria were defined to address both absolute negative potentials and large differential potential at the same time. This is generally speaking a difficult task because LANL data can be used to compute absolute potential but not differential. Therefore, Matéo-Vélez et al. (2016) proposed different ways to define a worst-case depending on the relative importance of low and high energy electron fluxes. The best correlation with absolute charging was obtained with PG5k, of course, by definition, and with FE10k. However, LFHE and HFAE should not be dismissed because, first, a large fraction of them was associated with potential below  $-100$  V, and, second, they can theoretically generate high levels of differential charging levels due to specific interaction of electrons with insulators. This is why all these 4 criteria are relevant for the present study with the goal to assess risks of surface charging leading possibly to electrostatic discharges and, in the end, to spacecraft anomalies.

Each event in all 400 events was attributed with the corresponding values of  $Kp$ , AE, AL (Auroral Lower), and SYM-H (symmetric disturbance magnetic field in H-component) indices and solar wind and IMF parameters, namely, IMF  $B_z$ , solar wind speed, proton number density, and derived electric field  $E_y$  and  $\langle VB_s \rangle$ . For solar wind and IMF data, OMNIWeb (<http://omniweb.gsfc.nasa.gov/>) was used, so,  $E_y$  was obtained directly from there and  $\langle VB_s \rangle$  was computed using solar wind speed and  $B_s$ , defined as  $B_s = |B_z|$ , if  $B_z$  is negative and  $B_s = 0$  otherwise. Geomagnetic indices were obtained from the World Data Center for Geomagnetism, Kyoto (<http://wdc.kugi.kyoto-u.ac.jp/wdc/Sec3.html>). The dependencies on solar wind and IMF parameters and geomagnetic indices of the events in each criterion were then studied.



### 3. Worst-Case Severe Environments for Surface Charging and Current Geomagnetic Activity

#### 3.1. Dependence on Geomagnetic Indices

##### 3.1.1. *Kp* Index

We start with dependencies on geomagnetic indices. The four top panels in Figure 1a present the histograms of top 100 events with worst-case severe environments for surface charging as dependent on the *Kp* index observed during these events. These severe environment events in 15-min intervals were identified by Matéo-Vélez et al. (2018) following the criteria PG5k (top panel, purple), LFHE (second panel, green), HFAE (third panel, red), and FE10k (forth panel, blue). The *Kp* index occurrence rate (orange line) for the entire period of 1990–2005 (irrespective of the environment condition) is shown in the bottom panel. The *Kp* binning was done so that the [0,1) bin includes *Kp* values of 0, 0+, and 1–, the [1, 2) bin includes *Kp* = 1, 1+, and 2–, and so on, and the (8,9) bin includes *Kp* = 8, 8+, 9–, and 9.

Several features can be noticed in the plotted histograms:

1. The histograms showing the number of severe environment events in all four criteria do not coincide with the 16 years occurrence rate of the *Kp* index (orange line in the bottom panel). The highest occurrence rate for the observed *Kp* is from 1 to 3. If they would have coincided, for each *Kp* value, the probability of the presence of a severe environment would be the same, independent of *Kp*. Since this is not the case, the *Kp* value can be considered as an indicator for an event to happen.
2. The PG5k histogram, which corresponds to the spacecraft potential criterion, has its peak at *Kp* = 3–4 (39 events), whereas all the histograms for criteria based on electron fluxes show maximum values at *Kp* = 4–5 (25–30 events), except for HFAE criterion which has a wider peak at *Kp* = 3–5.
3. There are more PG5k events at smaller *Kp* (6 events at *Kp* = 1–2 and 20 events at *Kp* = 2–3) as compared to flux based events with negligible number at *Kp* = 1–2 and 5–11 events at *Kp* = 2–3).
4. More events with flux based criteria occurred at higher *Kp* (>5) than those of spacecraft potential based criterion: there were ≤6 PG5k events in each *Kp* bin for *Kp* > 5, whereas 18 LFHE and 20 FE10k events were detected at *Kp* = 5–7 and 19 HFAE events at *Kp* = 5–6. For large *Kp* > 7, only the FE10k criterion showed 16 (*Kp* = 7–8) and 8 (*Kp* = 8–9) events. Obviously, the *Kp*-dependent histograms for severe environment events do not reveal fully the risk to encounter the severe environment for given *Kp*: statistical decrease of the occurrence rate of higher *Kp* values (see bottom panel in Figure 1a) should be taken into account. In other words, the decrease in histograms for high *Kp* values during severe environment events may just reflect the lower probability of high *Kp* occurrence but not a lower risk of severe environment.

To address this issue, we developed a specific normalization procedure. The idea is to normalize the number of severe environment events for each *Kp* bin by the total number of LANL observations corresponding to this *Kp* bin. The only data analyzed in the present paper are the times and locations of 400 worst-case events, not the full, original LANL data set (it was not freely available). What was available is the total numbers of 15-min averages of the LANL observations in 20–08 MLT sector for different years used in Matéo-Vélez et al. (2018) given in Table 1. These numbers include all observations from all operating LANL spacecraft. The choice of 20–08 MLT sector is due to the finding that all of the worst-case severe environments were detected at local times from 20 to 08 MLT (see Figure 6b of Matéo-Vélez et al., 2018). Thus, we calculate the chance to encounter the severe environment in the top 100 only for this MLT sector. The total number of LANL observations in a given *Kp* bin can be estimated by multiplying these numbers for the normalized *Kp* occurrence for given bin and year. In more details, the normalization algorithm can be explained as follows.

For a particular year, the number of events with detected top 100 worst-case severe environments for one particular *Kp* bin for all operating LANL spacecraft is  $N_{eventsLANL}$ . Let the total number of LANL 15-min observations in 20–08 MLT sector be  $N_{LANL}$  (Table 1). To estimate the number of available LANL 15-min observations for the particular *Kp* bin, the total number  $N_{LANL}$  must be multiplied by the occurrence rate  $N_{Kp,norm}$  (Figure 1a, bottom panel) of the *Kp* index for this bin for this year.  $N_{Kp,norm}$  is computed as  $N_{Kp}/N_{Kp,all}$ , where  $N_{Kp}$  is the number of *Kp* records in a given *Kp* bin (at a given *Kp* value) for this year (irrespective of what LANL observes, just using the *Kp* index distribution), and  $N_{Kp,all}$  is the total number of *Kp* records (number of 3 h intervals in a year).

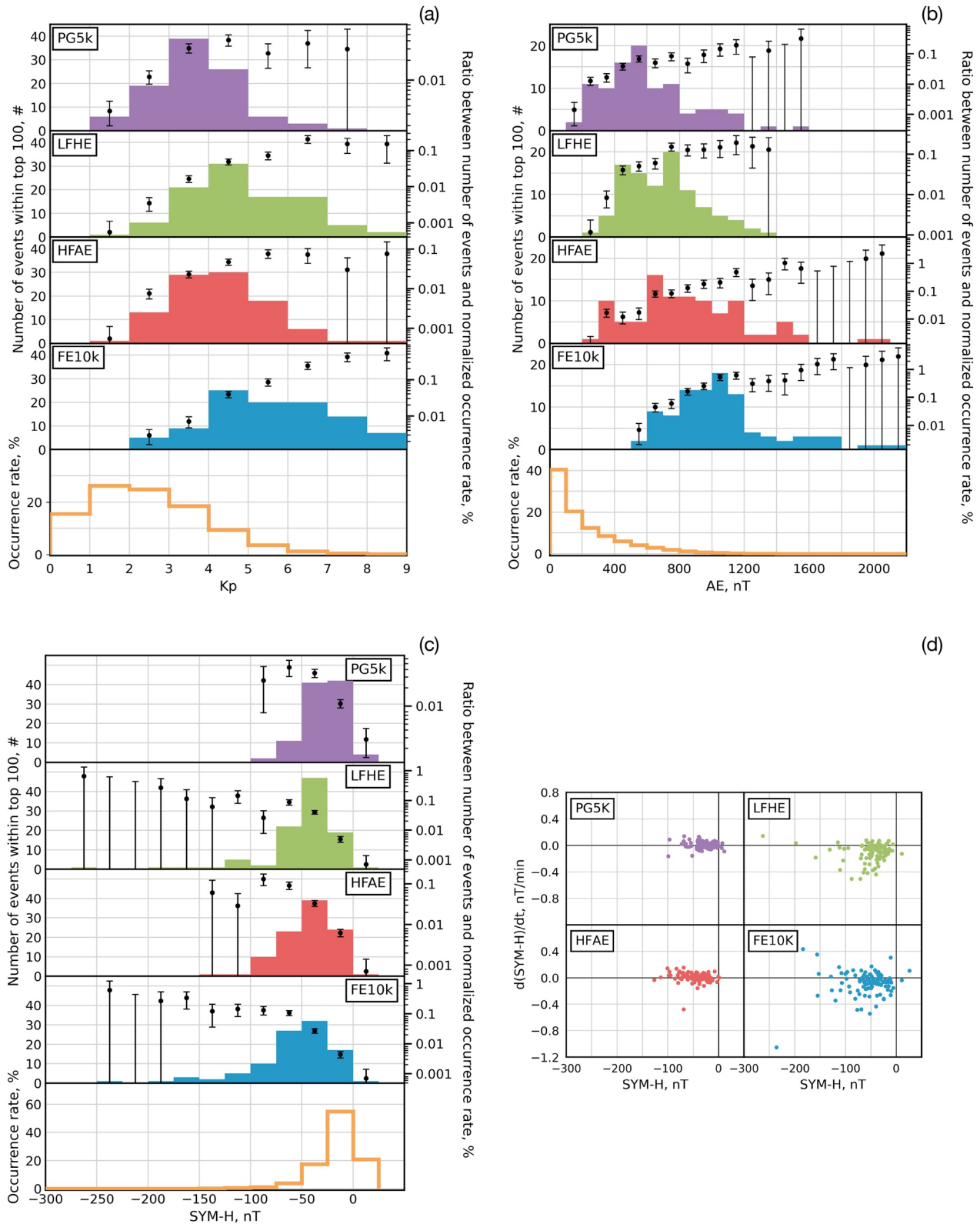


Figure 1.

**Table 1**

Total Numbers of 15-Min Averages of the LANL Observations in 20–08 MLT Sector for Different Years From all LANL Spacecraft Used in Matéo-Vélez et al. (2018)

Year	1990	1991	1992	1993	1994	1995	1996	1997
Observations	13,786	26,044	34,745	32,117	26,044	33,284	42,311	43,627
Year	1998	1999	2000	2001	2002	2003	2004	2005
Observations	44,925	53,001	43,439	39,115	65,062	69,113	64,823	53,185

Now, for a given year, the normalized occurrence rate for an event in the list of top 100 severe environment events in a given  $Kp$  bin can be estimated as the number of severe events for a given  $Kp$  bin divided by the estimate for the number of all LANL observations for a given  $Kp$  bin:

$$\text{Normalized occurrence rate} = \frac{N_{\text{eventsLANL}}}{N_{Kp}^{\text{norm}} \cdot N_{\text{LANL}}} \cdot 100\%. \quad (1)$$

To get the average risk (normalized occurrence rate), we sum over all years:

$$\langle \text{Normalized occurrence rate} \rangle = \frac{\sum_{i=1990}^{2005} N_{\text{eventsLANL}_i}}{\sum_{i=1990}^{2005} N_{Kp}^{\text{norm}_i} \cdot N_{\text{LANL}_i}} \cdot 100\%. \quad (2)$$

It should be noted that this method of normalization does not perfectly suits to PG5k criterion events because almost all these events occurred in eclipse. This means that being in eclipse is a necessary condition to have such an event. Therefore, PG5k events should be normalized by the total time the spacecraft spends in eclipse for a given  $Kp$  bin. Since the eclipse conditions for GEO occur at around the equinoxes and the geomagnetic activity has semiannual variation (Russel-McPherron effect) (Russell & McPherron, 1973), it is impossible to do such normalization without the orbital information. For this reason, we estimate the risk to have PG5k event using the same method as for other criteria and keeping in mind this specific feature of PG5k events (duration of charging but not peak value). It should be emphasized that we define the risk as a chance to have one of the 100 top events (but not to exceed certain threshold). For this reason, the PG5k risk values can be compared to the ones of other criteria.

The normalized severe environment occurrence rate is shown by black dots in the four top panels of Figure 1a. It is important to note that the normalized occurrence rate described above is different from that of shown in the bottom panel of Figure 1a. The black dots can be considered as an indicator of a risk to detect a top 100 worst-case severe environment event in a 15-min window for a given  $Kp$  bin.

The uncertainties for each normalized severe environment occurrence rate (black dot) are shown with vertical bars in Figures 1a–1c. The uncertainties were calculated using the counting error as  $\delta_Q = \sqrt{N_Q}$ , where  $N_Q$  is the number of observations in the sample  $Q$ . When computing the uncertainties for the normalized occurrence rate given by Equation 2, we assume that the uncertainties from quantities in the denominator are negligible compared to those from  $N_{\text{eventsLANL}}$ . So, uncertainty  $\delta$  of the risk for severe environment occurrence is:

$$\delta = \frac{\sqrt{\sum_{i=1990}^{2005} N_{\text{eventsLANL}_i}}}{\sum_{i=1990}^{2005} N_{Kp}^{\text{norm}_i} \cdot N_{\text{LANL}_i}} \cdot 100\%. \quad (3)$$

As it can be noticed in Figures 1a–1c, the uncertainties for  $Kp$  bins with less than 2 events (for  $Kp$  from 1 to 2 for LFHE and HFAE criteria, for  $Kp$  from 7 to 8 for PG5k and HFAE criteria, and for  $Kp$  from 8 to 9 for HFAE criterion) have their lower limit as zero. Variations in both upper and lower limits in the uncertainty bars are important for determining a trend in the dependence of risks on the value of  $Kp$ . The risks that

**Figure 1.** Number of events with top 100 15-min-averaged worst-case severe environments for surface charging to occur for the criteria PG5k (top panel, purple), LFHE (second panel, green), HFAE (third panel, red), and FE10k (forth panel, blue) as dependent on the (a)  $Kp$  index, (b) AE index, and (c) SYM-H index. The occurrence rate (orange line) of the observed index for 1990–2005 is shown in the bottom panels. Black dots demonstrate the normalized severe environment occurrence rate with uncertainties shown as bars. (d) The  $d(\text{SYM-H})/dt(\text{SYM-H})$  versus SYM-H for all events for four criteria: negative  $d(\text{SYM-H})/dt$  values indicate the main phase of a storm (see the text for details).



have their lower limit in the uncertainty bar equal to zero are considered much less significant and excluded when analyzing the dependencies.

The risk is different for each criterion (note that risk values for PG5k are not 100% directly comparable to other criteria). For PG5k, the highest risk (for all  $Kp$  bins with more than 1 events) to detect the severe environment is no more than  $0.04\% \pm 0.008\%$ , for LFHE, it is  $0.2\% \pm 0.05\%$ , for HFAE— $0.08\% \pm 0.02\%$ , and for FE10k— $0.5\% \pm 0.2\%$ . These numbers can look very small and give the impression that there is not whatsoever dependence of severe environment occurrence on any of  $Kp$  index value. It should be stressed particularly that while analyzing these numbers, it is important to keep in mind the definition of those selected 100 events in each criteria: only the top 100 15-min-averaged worst-case severe environments. It is expected that the chance of getting the particular event out of only 100 selected at a certain time and spacecraft location for a particular  $Kp$  bin during 16 years cannot be high. The calculated uncertainties are much larger for higher  $Kp$  values when the number of events is very small. Overall, the smaller the number of events, the larger the uncertainty.

The analysis of risks shows the following:

1. We see the order of magnitude difference in risks with the largest for FE10k criterion and smallest for PG5k criterion (keeping in mind eclipse events in PG5k criterion, see above).
2. The only criterion which indicates an increase of observing severe environment with  $Kp$  increase is FE10k, highest fluxes of electrons at energies above 10 keV. All other criteria show the initial increase with  $Kp$  up to  $Kp = 4-5$  and somewhat saturation at higher  $Kp$ . The trends in the uncertainties are in agreement with those of the risks. There are not so many events with  $Kp > 6-7$  during all 16 years as the bottom panel shows. At the same time, the number of FE10k events for  $Kp > 6$  is not small, therefore, worst-case severe environments can occur often when  $Kp$  is high, which is not true for other criteria.

The conducted analysis demonstrates that the magnetosphere needs to be in an active state ( $Kp > 2$ ) for an event to happen, but it is not necessarily true that a higher  $Kp$  value means that more events will be detected

### 3.1.2. AE Index

Figure 1b demonstrates the relationships between the events with top 100 15-min-averaged worst-case severe environments for surface charging and the AE index in a similar form as in Figure 1a for the  $Kp$  index. The values used to plot each histogram (first four panels) are the median AE index observed during  $\pm 5$  min from the start of the worst-case severe environment event. The bottom histogram (orange line) presents the AE occurrence rate computed for the entire period of 1990–2005 irrespective of the environment conditions. The values for black dots and uncertainties for them were computed similarly to those of the  $Kp$  index.

The uncertainties for the AE bins with no LANL events between the AE bins where events are present (e.g., in Figure 1b, for AE from 1,200 to 1,300 nT and from 1,400 to 1,500 nT for PG5k criterion) are computed assuming that the LANL events count is zero with a counting error of one for that bin, and the risk uncertainty is calculated using a counting error of one, instead of zero. For these bins, we show the risk at zero with its estimated upper limit uncertainty bar, lower limit being zero. The computed uncertainties for such bins are not significant for analyzing the trends in the parameter dependencies.

Analyzing the plotted histograms, it can be noticed that:

1. Similarly to the  $Kp$  index, the histograms showing the number of severe environment events in all four criteria do not coincide with the 16 years occurrence rate of the AE index (orange line in the bottom panel). The maximum occurrence rate of 40% occurs at AE = 0–100 nT with 20% at AE = 100–200 nT, which corresponds to an absence of substorm activity or rather small substorms; hence, the AE index can be considered as an indicator for an event to happen.
2. The PG5k spacecraft potential criterion histogram peaks with 20 events at AE of 500–600 nT where about 10 events occurred in each bin with AE from 200 to 800 nT. For higher AE values of 800–1,200 nT, the number of events is low, not more than 5 in each AE bin and almost no events for AE > 1,200 nT. A rather different pattern can be seen on the flux-related FE10k criterion histogram, which has a peak of 18 events at AE of 1,000–1,100 nT with about 10 or more events in each AE bin for AE of 600–1,200 nT. In contrast to the spacecraft potential criterion, there are events for AE > 1,200 nT (though, less than 5 in each AE bin but 20 in total). LFHE (20 events) and HFAE (15 events) criteria peaks are in the middle,

being at 700–800 and 600–700 nT of AE, respectively. LFHE events of meaningful numbers occur when AE is between 300 and 1,200 nT and for HFAE events this AE interval is 300–1,600 nT—almost the same. Thus, similarly to Figure 1a, the FE10k environment is more likely to occur during increased magnetospheric activity compared to the other criteria.

3. The normalized occurrence rate for severe environment events shown as black dots show that the highest risk to detect the severe environment is about one order of magnitude higher for three criteria, PG5k, HFAE, and FE10k, when the AE index is elevated as compared to the  $K_p$  index. The highest percentage of  $2.3\% \pm 1.3\%$  is again for flux-related FE10k criterion. At the same time, for HFAE criterion, it is  $1.0\% \pm 0.5\%$  and for PG5k— $0.2\% \pm 0.1\%$ . These are maximum values, but even if we look at the AE intervals with a meaningful number of events, the average percentages are still higher than for the  $K_p$  index. Again, regardless of the small percentages, the maximum chance of getting the particular event out of only 100 selected at a certain time and spacecraft location for a particular AE bin during 16 years is one order of magnitude higher than for the  $K_p$  index.
4. We cannot state that there is a linear increase of the highest risk to detect the severe environment with the increase of the AE index (taking all the risks with nonzero lower limit for corresponding uncertainty). Black dots for all criteria show a decrease with the decrease of the observed events for higher AE values, but largest substorm activity (as indicated by the large AE index values) results in the highest probability for a severe environment to develop. Substorm activity (represented by AE) is a more important factor than a general disturbed state of the magnetosphere (represented by  $K_p$ ) for severe environments for surface charging to occur

### 3.1.3. SYM-H Index

Figure 1c demonstrates the dependencies of the events with top 100 15-min-averaged worst-case severe environments for surface charging on the SYM-H index in a similar form as in Figure 1a for the  $K_p$  index and in Figure 1b for the AE index. The values for SYM-H at the first four panels are the median values of SYM-H from  $\pm 10$  min from the start of the worst-case severe environment event. The bottom histogram (orange line) shows the SYM-H occurrence rate similar to Figure 1a for  $K_p$ . The black dots and uncertainties for them were computed in the same way as in Figure 1a for  $K_p$  index. The main features are the followings:

1. The histograms showing the number of severe environment events in three criteria based on electron fluxes do not coincide with the 16 years occurrence rate of the SYM-H index (orange line in the bottom panel). The maximum occurrence rate of 55% occurs at SYM-H between 0 and  $-25$  nT which is not during storm times and only 20% at positive SYM-H =  $0-25$  nT and at SYM-H from  $-25$  to  $-50$  nT which can indicate small storm activity. LFHE (45 events), HFAE (40 events), and FE10k (32 events) histograms have their peaks at SYM-H from  $-25$  to  $-50$  nT, but there are 28 events in FE10k criterion at SYM-H from  $-50$  to  $-75$  nT. In contrast to other criteria, all events in spacecraft potential criterion PG5k were detected for SYM-H  $> -100$  nT (40 events were seen in each SYM-H interval of 0 to  $-25$  nT and  $-25$  to  $-50$  nT).
2. As for  $K_p$  and AE indices, more events in FE10k criterion were detected for higher magnitudes of SYM-H as compared to other criteria, which indicates that these events occur during larger storms as compared to other criteria: about 45 out of the 100 FE10k events occur at SYM-H  $< -50$  nT, 25 events for LFHE and about 35 for HFAE.
3. The severe environment normalized occurrence rate in each bin (black dots) show increase for all the criteria up to SYM-H in the  $-50$  to  $-75$  nT range ( $-50$  to  $-100$  nT for HFAE) and then a drop for PG5k and LFHE criteria and with consequent increase for LFHE events. Again, we do not analyze the SYM-H bins where only 1 event was detected which show an increase in risks for large negative SYM-H with zero lower limit for uncertainties. For the FE10k criterion, the dots reach a saturation for SYM-H from  $-50$  to  $-150$  nT and then increase. Since there are very few events at large negative SYM-H, we cannot conclude that more events will occur at strong storm times.
4. The severe environment risk percentages are small: only  $0.04\% \pm 0.01\%$  for PG5k,  $0.14\% \pm 0.06\%$  for LFHE,  $0.13\% \pm 0.04\%$  for HFAE, and  $0.3\% \pm 0.2\%$  for FE10k. These percentages are very similar and highest for LFHE and FE10k criteria as those of the  $K_p$  index dependencies. Out of three indices, the AE index is the best indicator of a severe environment for surface charging to occur.

Figure 1d presents the time derivative of the SYM-H index versus the SYM-H index during the top 100 severe environment events (each point corresponds to one event). Four panels correspond to events selected using different criteria. The values for SYM-H are the median values of SYM-H from  $\pm 10$  min from the start of the worst-case severe environment event. To calculate the SYM-H index derivative, we transformed the SYM-H time-series to the frequency space using the fast Fourier transform (FFT). The FFT was computed for a  $\sim 34$  h interval centered on the event time. Harmonics with a period  $< 6$  h (frequencies greater than  $50.0 \cdot 10^{-6}$  Hz) were zeroed, and a derivative was computed after inverse transformation. It is, therefore, a derivative of a smooth signal, where all short-scale variations (substorm-related) were filtered out. Negative large  $d(\text{SYM-H})/dt$  values when the SYM-H index is strongly negative indicate that main phase of a storm was in progress during worst-case severe environment events. Positive  $d(\text{SYM-H})/dt$  values at negative SYM-H correspond to the storm recovery phase.

As can be seen, the spacecraft potential-based PG5k events are all concentrated within SYM-H  $> -100$  nT with most points at 0 to  $-50$  nT and corresponding  $d(\text{SYM-H})/dt$  values are  $\pm 0.15$  nT/min, which corresponds to rather small increases and decreases in SYM-H during the events but not to any significant storms. Strong storm activity does not result in severe environments for surface charging with PG5k criterion. Similar features are noticeable for HFAE criterion: although covering larger SYM-H interval from 0 to  $-125$  nT,  $d(\text{SYM-H})/dt$  was  $\pm 0.2$  nT/min and only one event with  $-0.45$  nT/min at about  $-75$  nT of SYM-H, which can correspond to a main storm phase. There are more events with positive  $d(\text{SYM-H})/dt$ , which can be an indicator that HFAE events occur during small storm recovery. As can be seen in Figure 1c, PG5k and HFAE criteria have the lowest risk for detecting severe environments for any SYM-H index range.

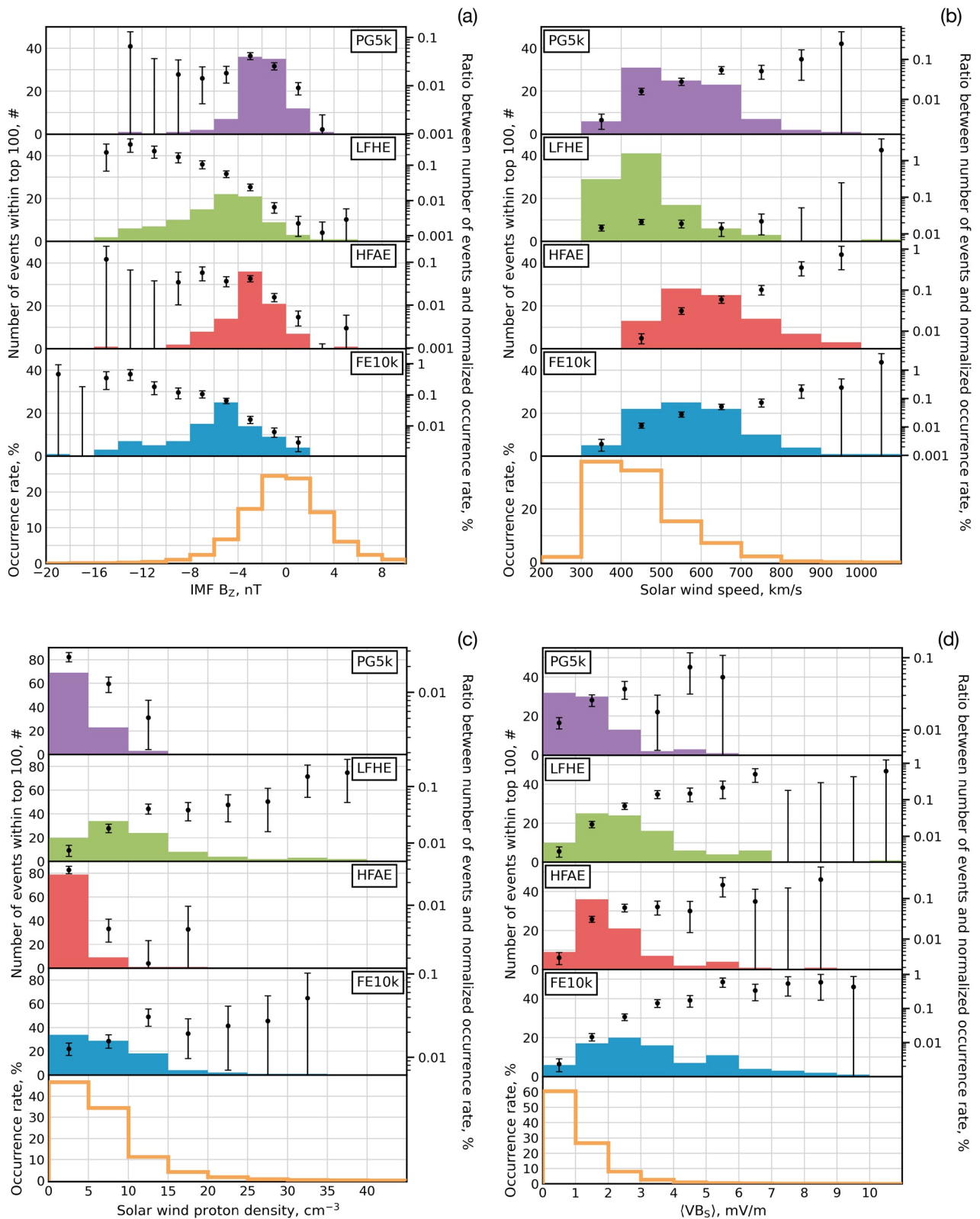
For LFHE criterion, the majority of events is still situated at SYM-H from 0 to  $-75$  nT, but there are nine events at SYM-H of  $-75$  to  $-150$  nT; most of the events have negative  $d(\text{SYM-H})/dt$  with several reaching of about  $-0.4$  to  $-0.5$  nT/min, which points to their occurrence during a storm main phase. It needs to be stressed here that the largest negative  $d(\text{SYM-H})/dt$  values are still at SYM-H of  $-100$  nT or more. FE10k criterion events are more distributed over SYM-H and  $d(\text{SYM-H})/dt$  with many points concentrated at 0 to  $-75$  nT of SYM-H but about the same number of them are with negative  $d(\text{SYM-H})/dt$  values of  $-0.4$  to  $-0.6$  nT/min or more for SYM-H from 0 to  $-150$  nT. One outlier is at  $-245$  nT of SYM-H and with about  $-1$  nT/min, which corresponds to a strong storm. At the same time, about one-third of all events are with positive  $d(\text{SYM-H})/dt$  values but only 10 of them are during SYM-H  $< 100$  nT, indicating that FE10k events mainly occur during small and moderate storm recovery. Thus, most of the LFHE events can occur during the main phase of small to moderate (up to  $-150$  nT) storms. This is true for the FE10k events, although FE10k events can also be detected during small to moderate storm recovery phase.

### 3.2. Dependence on IMF and Solar Wind Parameters

#### 3.2.1. IMF $B_z$

Figure 2a presents, in a similar way as Figures 1a–1c, the histograms of the top 100 events with worst-case severe environments for surface charging as dependent on the IMF  $B_z$  observed during these events. The values of IMF  $B_z$  at the first four panels are the averaged values of IMF  $B_z$  during 1 h before the worst-case severe environment event. The bottom panel shows the histogram of the occurrence rate (orange line) of the observed IMF  $B_z$  for the entire period of 1990–2005 computed as the percentage ratio between the number of times when IMF  $B_z$  fell into each bin (one bin is 2 nT) normalized by the total number of IMF  $B_z$  observations during 1990–2005. The values for black dots and uncertainties for them were computed similarly as described for the  $K_p$  index (see Figure 1a description). IMF  $B_z$  dependencies of the events of severe environments for surface charging show that:

1. The occurrence rate (orange line) of the observed IMF  $B_z$  has a symmetric shape in respect to IMF  $B_z = 0$  nT, with a maximum number at IMF  $B_z = \pm 2$  nT. None of the histograms of each criterion has a similar peak location. This argues for the probability of detecting severe environments being dependent on IMF  $B_z$ , so IMF  $B_z$  can be considered as an factor influencing the occurrence of events. The histogram of the spacecraft potential based criterion PG5k shows a distinct, wider peak at IMF  $B_z$  from 0 to  $-4$  nT with 67 events for this IMF  $B_z$  interval and  $< 10$  events for IMF  $B_z < -4$  nT. The HFAE histogram also exhibits a pronounced peak with 36 events at  $-4$  nT  $< \text{IMF } B_z < -2$  nT. Histograms for LFHE and



**Figure 2.** Similar to Figure 1, the number of events with top 100 15-min-averaged worst-case severe environments for surface charging to occur for four criteria as dependent on the (a) Interplanetary magnetic field  $B_z$ , (b) Solar wind speed, (c) Number density, and (d)  $\langle VB_s \rangle$  with the occurrence rate (bottom panel, orange) of the observed IMF and solar wind parameters for 1990–2005.

- FE10k show more distributed shapes, with a wider peak of 40 events at IMF  $B_z$  from  $-2$  to  $-6$  nT and with 25 events at IMF  $B_z$  from  $-4$  to  $-6$  nT, respectively.
- In addition to the peaks, the majority of the events for all criteria have occurred when the preceding hourly averaged IMF  $B_z$  was negative. At the same time, there are about 25 events (out of 400), which occurred when the average IMF  $B_z$  was positive. These events are present for each criteria with the largest number for PG5k, then HFAE, FE10k, and with the smallest number for LFHE. Since we used averaged values of IMF  $B_z$  during one hour before each event to plot the histograms, IMF  $B_z$  should have been predominantly positive during that hour before the event but not necessarily all positive.
  - More events with LFHE and FE10k criteria have occurred at IMF  $B_z < -6$  nT than for PG5k and HFAE criteria and they occur at  $-16$  nT  $<$  IMF  $B_z < -8$  nT when the number of PG5k and HFAE events were negligible.
  - The risk to have severe environments represented by black dots with uncertainties increases with IMF  $B_z$  becoming more negative for the LFHE and FE10k criteria, but then it goes down in one IMF  $B_z$  bin of  $-14$  to  $-16$  nT. For PG5k and HFAE criteria, there is no similar dependence: risk for PG5k criterion drops but for HFAE criterion it reaches some saturation at IMF  $B_z < -4$  nT. The ratio percentages are small, though, ranging from  $0.04\% \pm 0.007\%$  to  $0.46\% \pm 0.18\%$  and this is similar to those for  $K_p$  and SYM-H indices.

### 3.2.2. Solar Wind Speed

Similar to Figure 2a, Figure 2b presents the dependencies of worst-case severe environments on the solar wind speed  $V_{SW}$ . The noticeable features are:

- The occurrence rate (orange line) of the observed  $V_{SW}$  has its maximum at  $V_{SW} = 300$ – $500$  km/s with higher rate at  $V_{SW} = 300$ – $400$  km/s. None of the histograms of each criterion has the exact same peak location, except the histogram for LFHE criterion peaks with 40 events at  $V_{SW} = 400$ – $500$  km/s and with 29 events at  $V_{SW} = 300$ – $400$  km/s. Other two criteria based on fluxes, HFAE and FE10k, do not exhibit any defined peaks in a specific  $V_{SW}$  interval with about 20 of events in each 100 km/s bin distributed over  $V_{SW} = 400$ – $700$  km/s for FE10k and 27–28 events each at  $V_{SW} = 500$ – $700$  km/s and 12 events each at  $V_{SW} = 400$ – $500$  and  $700$ – $800$  km/s. The histogram of the spacecraft potential based criterion PG5k also shows a wider peak covering  $V_{SW} = 400$ – $700$  km/s with 30 to 23 events.  $V_{SW}$  can be considered as a factor influencing the occurrence of events.
- For higher  $V_{SW} = 700$ – $900$  km/s, there are more events corresponding to HFAE and FE10k criteria than with PG5k and LFHE.
- The risk to have severe environments represented by black dots with uncertainties increases with  $V_{SW}$  increase for PG5k, HFAE, and FE10k criteria, reaching  $0.1\% \pm 0.07\%$ ,  $0.7\% \pm 0.4\%$ , and  $0.2\% \pm 0.1\%$ , respectively. These percentages are about order of magnitude higher than those for IMF  $B_z$ . The only criterion that exhibits an order of magnitude lower risk as compared to IMF  $B_z$  is the LFHE one with a maximum value of  $0.02\% \pm 0.003\%$ . The risk for this criterion does not increase gradually with  $V_{SW}$  but dips into lower magnitude at  $V_{SW} = 600$ – $700$  km/s increasing again in the next  $V_{SW}$  interval.

In addition to the AE index,  $V_{SW}$  can be considered an indicator of a severe environment for surface charging to occur.

### 3.2.3. Solar Wind Proton Density

Figure 2c shows the histograms demonstrating the dependencies of worst-case severe environments on the solar wind number density  $N_{SW}$ . It can be seen that:

- Peaks of severe environment events for PG5k and HFAE criteria coincide with the maximum occurrence rate (orange line) of the observed  $N_{SW}$  at  $N_{SW} = 0$ – $5$   $cm^{-3}$ . The occurrence rate decreases for larger values of the observed  $N_{SW}$ , so does the number of PG5k and HFAE events, with almost no events detected at  $N_{SW} > 10$   $cm^{-3}$ . The probability for a PG5k and HFAE event to happen does not depend on  $N_{SW}$ . The risk to have severe environments shown by black dots is about  $0.03\% \pm 0.003\%$  and decreases with the  $N_{SW}$  increase.
- Events with LFHE criterion show more distributed peak with 35 of them at  $N_{SW} = 5$ – $10$   $cm^{-3}$  and with 20 each for  $N_{SW} = 0$ – $5$  and  $10$ – $15$   $cm^{-3}$ . Five to eight events were detected at larger  $N_{SW}$ , even at  $N_{SW} = 30$ – $40$   $cm^{-3}$ . The risk to have severe environment for this criterion shown by black dots exhibits some gradual



increase to only 0.05% at  $N_{SW} = 25\text{--}30\text{ cm}^{-3}$  with rise to  $0.18\% \pm 0.13\%$  at  $N_{SW} = 35\text{--}40\text{ cm}^{-3}$ . The percentage is about two times smaller than that for IMF  $B_Z$  but an order of magnitude larger than that for  $V_{SW}$  for the same criterion.

3. About 35 events for the FE10k criterion were detected at  $N_{SW} = 0\text{--}5\text{ cm}^{-3}$  but in the following  $N_{SW}$  intervals, the number of events did not drop sharply as for the PG5k and HFAE criteria (with 19 events at  $N_{SW} = 10\text{--}15\text{ cm}^{-3}$  and nonzero number of events up to  $N_{SW} = 30\text{--}35\text{ cm}^{-3}$ ). The risk to have severe environment for this criterion increases with  $N_{SW}$  increase with maximum percentage of  $0.03\% \pm 0.007\%$ , which is about one of order magnitude smaller than that for IMF  $B_Z$  and  $V_{SW}$  for the same criterion.

Based on the analysis above,  $N_{SW}$  is not a good indicator of a severe environment for surface charging to occur.

### 3.2.4. $\langle VB_s \rangle$

Figure 2d presents the dependencies of worst-case severe environments on  $\langle VB_s \rangle$ , where  $V$  is the solar wind speed and  $B_s$  is equal to zero, when IMF  $B_Z > 0$  and  $B_s = \text{IMF } B_Z$ , when IMF  $B_Z \leq 0$ . The  $\langle VB_s \rangle$  values in  $mV/m$  in the first four panels are 1-h averages before the start of each event. The  $\langle VB_s \rangle$  values in the bottom panel are calculated using a running 1-h averages over the years of 1990–2005. Note that the first bin of  $\langle VB_s \rangle$  (0–1  $mV/m$ ) includes all zero values of  $B_s$  and all positive values of  $B_Z$ . Examining Figure 2d, it can be noticed that:

1. The three criteria based on fluxes, LFHE, HFAE, and FE10k have their peaks at  $\langle VB_s \rangle > 1\text{ mV/m}$ . That means that the preceding hourly averaged IMF  $B_Z$  was southward. LFHE criterion peaked with about 25 events in 1–3  $mV/m$  bins, the HFAE criterion has a maximum of 35 events at  $\langle VB_s \rangle$  of 1–2  $mV/m$ , and FE10k shows a more distributed peak with 18–20 events in each bin from 1 to 4  $mV/m$ . For all three criteria, there are 10 or less events in the 0–1  $mV/m$  bin. In contrast, PG5k criterion has about 30 events that occur in each of 0–1 and 1–2  $mV/m$  bins. The occurrence rate (orange line) is highest at 0–1  $mV/m$ .
2. A severe environment defined by the PG5k criterion has the lowest risk (black dots) to occur,  $0.07\% \pm 0.04\%$ , among all four criteria. A large number of events in the 0–1  $mV/m$  bin coinciding with highest occurrence rate over 1990–2005 years and no obvious dependence of the risk on the magnitude of  $\langle VB_s \rangle$  can also be seen.
3. Events with LFHE criterion were detected over a wide range of  $\langle VB_s \rangle$  values, up to 7  $mV/m$ , with one outlier event in the 10–11  $mV/m$  bin. The risk for such an environment to occur is  $0.5\% \pm 0.2\%$ , and it increases with increasing of  $\langle VB_s \rangle$ .
4. HFAE and FE10k criteria events also occur at higher  $\langle VB_s \rangle$  magnitudes, up to 7  $mV/m$  (with one event in 8–9  $mV/m$  bin) and up to 10  $mV/m$ , respectively. The risk for the HFAE criterion severe environment to happen is  $0.02\% \pm 0.1\%$  with no clear dependence on the  $\langle VB_s \rangle$  magnitude. For the FE10k criterion, the percentage is higher,  $0.6\% \pm 0.18\%$ , with no dependence on the  $\langle VB_s \rangle$  magnitude, either. Since  $\langle VB_s \rangle$  is computed based on IMF  $B_Z$  and  $V_{SW}$  values, the risks are higher than those for solar wind number density and comparable with those shown in Figures 2a and 2b.

### 3.3. Risks for Severe Environments for Surface Charging Dependent on Criteria Definitions

As was shown in the sections above, the peaks in the number of severe environment events and the risks for these events to happen depend on how they are defined in four criteria. Tables 2 and 3 summarize the obtained results of the above analysis of Figures 1 and 2.

Table 2 demonstrates for each criterion at what bin of the observed parameter the maximum number of the severe environment events was reached, together with the range in brackets of the parameter values at which the events were detected. The first row in Table 2 also contains the observed ranges for each parameter during the 1990–2005 period (orange curves in the bottom panels in Figures 1 and 2).

Table 3 shows, for each criterion, the maximum risk in percentage to detect a worst-case severe environment event with the corresponding value of the parameter at this risk together with yes (Y) or no (N) for the dependence of the risk on the parameter.

**Table 2**  
Peaks in Number of Events With Corresponding Parameter Magnitude and Range

Criterion/ parameter (range)	$K_p$ , 0–9	AE, 0–2,200 nT	SYM-H, 50–300 nT	IMF $B_z$ , 20–10 nT	$V_{sw}$ , 200–1,100 km/s	$N_{sw}$ , 0–45 $\text{cm}^{-3}$	$\langle VB_s \rangle$ , 0–11 mV/m
PG5k	3–4 (1–8)	500–600 (100–1600)	0 to –50 (25 to –100)	0 to –4 (4 to –14)	400–700 (300–1,000)	0–5 (0–15)	0–2 (0–5)
LFHE	4–5 (1–9)	700–800 (200–1400)	–25 to –50 (25 to –275)	–2 to –6 (6 to –16)	400–500 (300–800)	5–10 (0–35)	2–3 (0–6)
HFAE	3–5 (1–9)	600–700 (200–2100)	–25 to –50 (25 to –150)	–2 to –4 (2 to –10)	500–700 (400–1,000)	0–5 (0–20)	1–2 (0–7)
FE10k	4–5(7) (2–9)	1000–1100 (500–2200)	–25 to –75 (25 to –250)	–4 to –6 (2 to –20)	400–700 (300–900)	0–5 (0–35)	1–4 (0–10)

Let us determine which parameter(s) can be considered as an indicator that a worst-case severe environment event would occur for each criterion. The PG5k is the only criterion which depends on the spacecraft potential, so it is supposed to be most relevant to surface charging events. It needs to be reminded that the majority of these events are in eclipse, so, they are with only the effect of plasma condition on spacecraft potential. This can lead to a very risky situation when the spacecraft is in eclipse and, for example, the values of  $V_{sw}$  are high.

For the PG5k criterion:

1. Worst-case severe environments occur under slightly disturbed conditions ( $K_p = 3–4$ , moderate sub-storm activity of 500–600 nT, no storm activity, no significant IMF  $B_z$ ,  $N_{sw}$ ,  $\langle VB_s \rangle$ ) but with  $V_{sw}$  elevated to 700 km/s (Table 2) and
2. Two parameters, AE and  $V_{sw}$ , can serve as indicators of the increased risk (maximum of  $0.2\% \pm 0.1\%$  at AE of 1100 nT and  $0.1\% \pm 0.07\%$  at  $V_{sw}$  of 800 km/s) for a worst-case severe environment event to occur and the risk for these events depends on the value of the parameters (Table 3).

The three other criteria are based on the fluxes and, therefore, are not directly related to the spacecraft potential. For the LFHE criterion:

1. Worst-case severe environments occur under moderately disturbed conditions ( $K_p = 4–5$ , moderate sub-storm activity of 700–800 nT, main phase of small storms, negative IMF  $B_z$  of –6 nT, no significant increase in  $V_{sw}$ ) but elevated  $N_{sw}$  of 5–10  $\text{cm}^{-3}$  and  $\langle VB_s \rangle$  of 2–3 mV/m (Table 2) and

**Table 3**  
Highest Risk With Corresponding Uncertainty to Detect a Worst-Case Severe Environment Event at the Corresponding Value of the Parameter and Presence of a Risk-Parameter Dependence

Criterion/ risk $\pm \delta$ , % param. (D)	$K_p$	AE, nT	SYM-H, nT	IMF $B_z$ , nT	$V_{sw}$ , km/s	$N_{sw}$ , $\text{cm}^{-3}$	$\langle VB_s \rangle$ , mV/m
PG5k	$0.04 \pm 0.008$ 4–5 (N)	$0.2 \pm 0.1$ 1100 (N)	$0.04 \pm 0.01$ –75 (N)	$0.04 \pm 0.007$ 4 (N)	$0.1 \pm 0.07$ 800 (Y)	$0.026 \pm 0.003$ 0 (N)	$0.07 \pm 0.04$ 4 (N)
LFHE	$0.2 \pm 0.05$ 6–7 (N)	$0.2 \pm 0.1$ 1100 (N)	$0.14 \pm 0.06$ –150 (N)	$0.4 \pm 0.16$ –14 (Y)	$0.02 \pm 0.003$ 700 (N)	$0.18 \pm 0.13$ 35 (Y)	$0.5 \pm 0.2$ 6 (Y)
HFAE	$0.08 \pm 0.02$ 5–6 (N)	$1.0 \pm 0.5$ 1400 (N)	$0.13 \pm 0.04$ –100 (Y)	$0.06 \pm 0.02$ –8 (N)	$0.7 \pm 0.4$ 900 (Y)	$0.03 \pm 0.003$ 0 (N)	$0.2 \pm 0.1$ 5 (N)
FE10k	$0.5 \pm 0.2$ 8–9 (Y)	$2.3 \pm 1.3$ 1700 (N)	$0.3 \pm 0.2$ –175 (N)	$0.46 \pm 0.18$ –14 (Y)	$0.2 \pm 0.1$ 800 (Y)	$0.03 \pm 0.007$ 10 (Y)	$0.6 \pm 0.18$ 8 (Y)

Note. IMF, interplanetary magnetic field.

2. The highest risks are associated with IMF  $B_z$  ( $0.4\% \pm 0.16\%$  at  $-14$  nT) and, as an effect,  $\langle VB_s \rangle$  ( $0.5\% \pm 0.2\%$  at  $6$  mV/m) and the risks exhibit dependencies on the values of these two parameters (Table 3). The question mark for the IMF  $B_z$  dependence stresses that the last dot in Figure 2a, second panel, does not fit into the dependence. The third parameter,  $N_{sw}$ , though not with high risk percentage, influences the risk so that it increases with  $N_{sw}$  increase.

For the HFAE criterion:

1. Worst-case severe environments occur under moderately disturbed conditions ( $Kp = 3-5$ , moderate substorm activity of  $600-700$  nT, recovery phase of small storms, negative IMF  $B_z$  of  $-4$  nT, no significant  $N_{sw}$  and  $\langle VB_s \rangle$ ) but with  $V_{sw}$  elevated to  $700$  km/s (Table 2) and
2. Similar to the PG5k criterion, two parameters, AE and  $V_{sw}$ , are related to the highest risks for a worst-case severe environment event to occur ( $1.0\% \pm 0.5\%$  at  $1,400$  nT and  $0.7\% \pm 0.4\%$  at  $900$  km/s), but only the risk associated with  $V_{sw}$  depends on its value. The third highest risk of  $0.2\% \pm 0.1\%$  is for  $\langle VB_s \rangle$  which follows from the high risk for  $V_{sw}$ .

For the FE10k criterion:

1. Worst-case severe environments occur under slightly more intensely disturbed conditions ( $Kp = 4-5(7)$ , intense substorm activity of  $1,000-1,100$  nT, main and recovery phases of small to moderate storms, negative IMF  $B_z$  of  $-6$  nT, no significant  $N_{sw}$ ) but with  $V_{sw}$  elevated to  $700$  km/s and, as follows,  $\langle VB_s \rangle$  of  $2-3$  mV/m (Table 2) and
2. All parameters (except of  $V_{sw}$  and  $N_{sw}$ ) have higher risks, as compared with the other three criteria, and for all of them (except of AE and SYM-H) the associated risks show the dependencies of parameters' values.

Thus, to summarize:

1. The range of geomagnetic conditions for maximum number of worst-case severe environments for surface charging to occur including all four criteria:
  - (a) Moderately disturbed with  $Kp$  from 3 to 5,
  - (b) Moderate to intense substorm activity with AE from 500 to 1000 nT,
  - (c) Storm activity from none to main and recovery phases of small to moderate storms,
  - (d) Slightly negative IMF  $B_z$  up to  $-6$  nT,
  - (e)  $V_{sw}$  from 400 and elevated to 700 km/s,
  - (f) Low  $N_{sw}$  with  $5-10$   $\text{cm}^{-3}$  only for one criteria of LFHE, and
  - (g) As follows from IMF  $B_z$  and  $V_{sw}$ ,  $\langle VB_s \rangle < 4$  mV/m;
2. Geomagnetic indices and IMF and solar wind parameters and their relations to the maximum risks for worst-case severe environments for surface charging to occur including all four criteria:
  - (a)  $Kp$  index is not associated with highest risk for worst-case severe environments to occur, the only criterion is FE10k for which the risk and the  $Kp$  value are related,
  - (b) AE index determines the highest/close to highest risk, except for the LFHE criterion, but the risk is not dependent on the AE magnitude,
  - (c) No high risk is related to the SYM-H index and there is no dependence on its value for the risk,
  - (d) Elevated risks with not 100% clear dependencies exist for IMF  $B_z$ ,
  - (e)  $V_{sw}$  directly indicates the highest risk for worst-case severe environments to happen and this risk depends on the  $V_{sw}$  value, except for the LFHE criteria,
  - (f) No high risk is associated with the  $N_{sw}$  but the risk depends on  $N_{sw}$  magnitude for the LFHE and FE10k criteria, and
  - (g) The risks for  $\langle VB_s \rangle$  are determined by the risks for IMF  $B_z$  and  $V_{sw}$ .

AE and  $V_{sw}$  are the most important parameters which can define the occurrence of worst-case severe environments for surface charging.

## 4. Worst-Case Severe Environments for Surface Charging With Superimposed Epoch Analysis

In addition to studying the dependencies of severe environments for surface charging on current activity defined by geomagnetic indices (Figure 1) and one hour averaged IMF and solar wind parameters (Figure 2), we conducted the superimposed epoch analysis for all the detected events with four criteria. The observed index or IMF or solar wind parameter during an event was plotted a certain number of hours before and after the time of an event and all of the plots were combined setting the time of the events as zero for all of them. Such analysis helps to identify the general behavior of the observed index or IMF or solar wind parameter before and after all events belonging to a specific criterion.

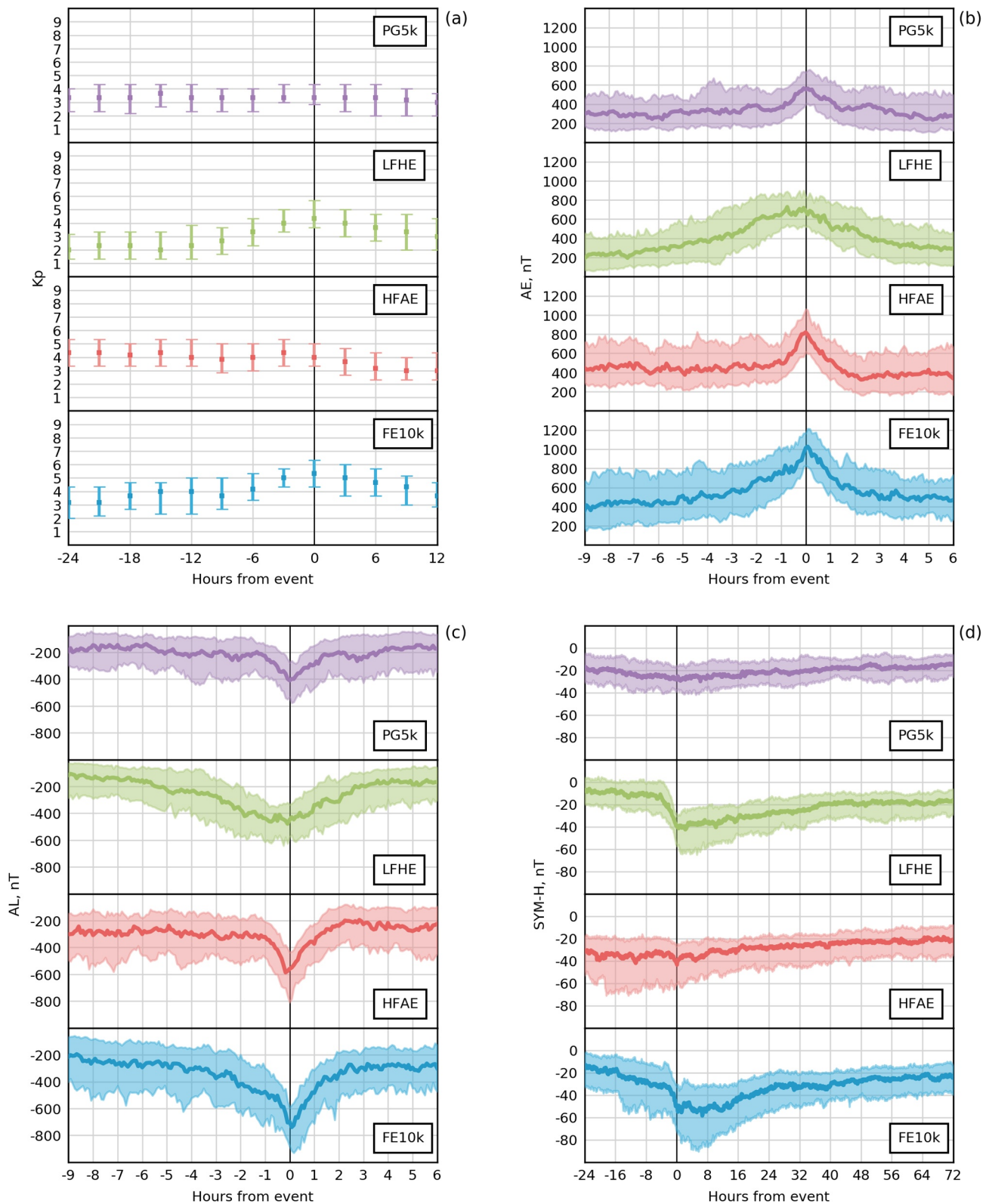
### 4.1. Geomagnetic Indices

Figure 3 demonstrates the results of the superimposed epoch analysis conducted for the variations of (a)  $Kp$ , (b) AE, (c) AL, and (d) SYM-H indices at around the detected top 100 15-min-averaged worst-case severe environments for surface charging. As in previous Figures 1 and 2, top panel is for PG5k (purple), second panel is for LFHE (green), third panel is for HFAE (red), and bottom panel is for FE10k (blue) criteria. Each panel presents the median value for the corresponding index (thick line, bold squares for  $Kp$ ) with the shaded area (bars for  $Kp$ ) of the interquartile range (25th–75th percentiles). In Figure 3a, for each event, the observed  $Kp$  values are plotted for every 3 h for the interval of 24 h before and 12 h after an event for the four criteria. The  $Kp$  index does not change much before and after events in the PG5k and HFAE criteria. At the same time, the  $Kp$  values before and after events were not low: around 3 for a PG5k event and 4 for a HFAE event (as shown by median). Two other criteria, both flux related, show the increase in  $Kp$  index before and decrease after the event with the peak at the time of the event. For LFHE events, the  $Kp$  index starts to increase from low values of 2–3 about 9 h before the event reaching about 4.5 at the time of the event with subsequent gradual decrease to 3 12 h after the event. The  $Kp$  index was somewhat elevated being between 3 and 4 during 24–6 h before the event in the FE10k criterion, reached about 5.3 and decreased to 4 in 12 h after the event. These variations are not big; nevertheless, the pattern of  $Kp$  changes as seen in the superimposed epoch analysis confirm that the magnetosphere needs to be in an active state ( $kp > 2$ ) for an event to occur.

Figure 3b shows the observed 1-min AE values plotted 9 h before and 6 h after the event for four criteria. For all criteria, the AE index was elevated as compared to times before and after an event. For the spacecraft potential criterion PG5k, the AE was about 300–400 nT during 8 h and then increased up to 600 nT during 1 h before the event with gradual decrease back to about 300 nT (looking at median values). The AE index during LFHE events gradually increased from 200 nT 9 h before the event reaching maximum values of 600 nT 1 h before the event and starting to decrease right at the time of the event, also going gradually back to 300 nT 6 h after the event.

The AE index during HFAE and FE10k criteria events shows the most sharp peaks. The AE index for HFAE events reached its peak of 800 nT during 1 h before the event being about 400 nT during 8 preceding hours and returned to this value of 400 nT in 2 h after the event. The AE index for FE10k events started to increase from 400-nT magnitudes 5 h before the event with the peak value of 1000 nT at the time of the event and decreased in 3 h—500 nT.

The AE index (Davis & Sugiura, 1966) was developed to reflect the strength of ionospheric currents flowing in the auroral oval during substorms. The AE index is the difference between the AU (auroral upper) index, which measures the strength of the eastward electrojet flowing from mid-afternoon toward midnight, and the AL (auroral lower) index which measures the strength of the westward electrojet that flows from dawn to past midnight. The AL component of AE is especially useful for substorm studies, since it is sensitive to the ionospheric currents that flow through the auroral bulge during the expansion phase (Akasofu et al., 1965). Therefore, in addition to the AE index, we show also the variations of the AL index in the present study. Figure 3c shows the observed 1-min AL values, similar to Figure 3b. For the AE index, the events in all four criteria occur when the AL index has its peaks (minima in this case). The most sharp and deep minima in AL are seen again for HFAE and FE10k criteria events, –600 and –750 nT in median, respectively. The behavior of AL is very similar as to AE before and after the events. The most gradual decrease before



**Figure 3.** Superimposed epoch analysis for the variations of (a)  $K_p$ , (b) AE, (c) AL, and (d) SYM-H indices at around the detected top 100 15-min-averaged worst-case severe environments for surface charging. Thick lines represent the median index value at each 1-min time step (bold squares for median  $K_p$  value at each 3-h time step) and shaded area (bars for  $K_p$  index) defines the interquartile range (25th–75th percentiles).



the event and recovery after the event is again evident for LFHE events: the minimum of  $-450$  nT is reached 1 h before the event and the recovery starts right at the event. The AL index during PG5k events exhibits a pattern very similar to the one for the AE index.

In Figure 3d, 1-min SYM-H values are plotted 24 h (1 day) before and 72 h (3 days) after the event for four criteria. The behavior of the SYM-H index is similar to that of the  $K_p$  index in such a way that no significant changes exist in the SYM-H index as seen in the median lines during PG5k and HFAE events but SYM-H variations are present for LFHE and FE10k criteria events (see Figure 3a for comparison). During PG5k events, the median SYM-H index is about  $-20$  nT 1 day before and 3 days after the event with slight decrease to  $-25$  nT at the time of the event. The median SYM-H during HFAE events does not show any dips before or after the event but SYM-H is  $-40$  nT 1 day before the event and as can be seen in the interquartile range, SYM-H can reach  $-60$  nT and stay like that 1 day before the event gradually increasing to  $-40$  nT after. The only criterion for an event to happen when SYM-H is minimal and the whole pattern of the SYM-H corresponds to a storm time one is the LFHE criteria. SYM-H being about  $-15$  nT in median 1 day before the event, starts to decrease sharply 4 h before the event. LFHE events occur during rather moderate SYM-H values, no lower than  $-60$  nT in minimum. In 3 days, the SYM-H index recovers back to  $-20$  nT. During FE10k events, the SYM-H index also decreases before the event but more gradually than during LFHE events. The event occurs right before the SYM-H minimum, not at the minimum. The minimum SYM-H value can be as low as  $-90$  nT within 8 h after the event according to the interquartile range. It should be noted that out of all indices, only AE and AL demonstrate clear variation for a PG5k event (PG5k is the only criterion connected to spacecraft potential).

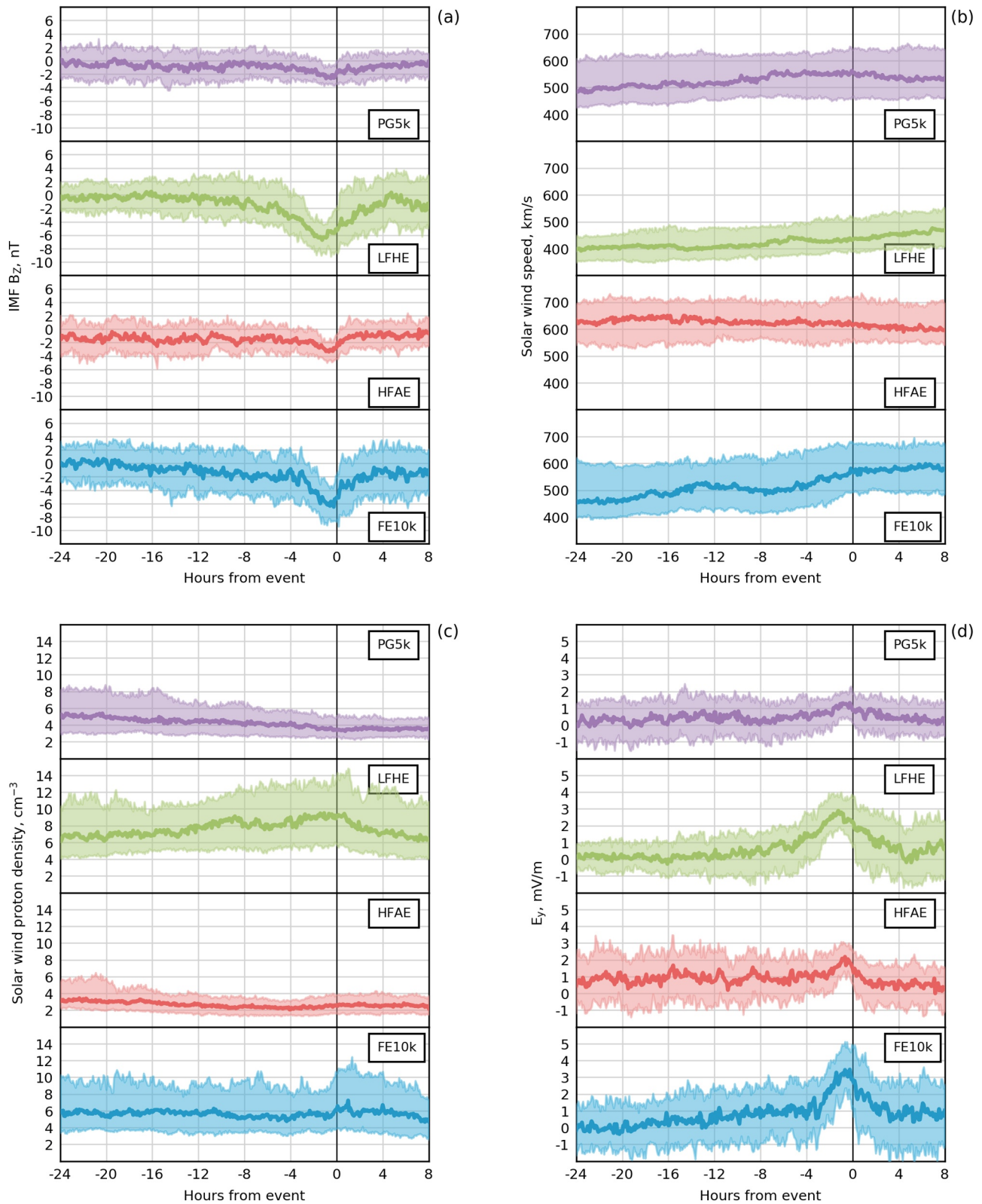
#### 4.2. IMF and Solar Wind Parameters

Similar to Figure 3, Figure 4 demonstrates the results of the superimposed epoch analysis conducted for the variations of (a) IMF  $B_z$ , (b) solar wind speed  $V_{SW}$ , (c) number density  $N_{SW}$ , and (d)  $E_y$  electric field at around the detected top 100 15-min-averaged worst-case severe environments for surface charging. In the superimposed epoch analysis, we use  $E_y$  instead of  $\langle VB_s \rangle$ , since the latter one is proportional to the integral (over 1 h prior to the epoch zero) of the former with zeroed values corresponding to positive IMF  $B_z$  measurements. Thick lines represent the median values at each 5-min time step and shaded area defines the interquartile range (25th–75th percentiles).

In Figure 4a, for each event, the observed 5-min IMF  $B_z$  values are plotted for the interval of 24 h before and 8 h after an event for four criteria. As can be seen, the most pronounced changes in the IMF  $B_z$  behavior before and after the event are for LFHE and FE10k criteria events, while changes are not so big for PG5k and HFAE events. During all events, IMF  $B_z$  exhibits a minimum but the occurrence of this minimum does not coincide with the time of the event, being always before the event. The delay is 1–2 h, which is around a typical substorm growth phase timescale.

For the LFHE criterion, the IMF  $B_z$  stays at about 0 nT in median from 24 to 8 h before the event, then starts to decrease, reaching its minimum of about  $-6$  nT 1.5 h before the event. IMF  $B_z$  recovers to zero by the 5 h after the event but then drops to  $-2$  nT. During the recovery, the range of interquartiles is wider than before the event, being  $-2$  to 2 nT from the median. IMF  $B_z$  during the FE10k criterion events show very similar time dependence: it decreased slowly to  $-2$  nT from 12 to 4 h before the event and then dropped faster to  $-6$  nT at about 1 h before the event. It comes back to about  $-1$  nT 4 h after the event. During PG5k and HFAE events, IMF  $B_z$  decreases before and increases after the event but the change is not larger than 1 nT.

Figure 4b presents the observed 5-min  $V_{SW}$  values plotted for the interval of 24 h before and 8 h after an event for the four criteria. No sharp variations in  $V_{SW}$  can be seen before and after the events in all four criteria, but  $V_{SW}$  is noticeably higher than the average solar wind velocity ( $\sim 400$  km/s) for all but LFHE criteria. For events in the PG5k criterion,  $V_{SW}$  is at about 500 km/s from 24 to 8 h before the event and then increases to 550 km/s and stays at that value. For events in the LFHE criterion, again from 24 to 8 h before the event,  $V_{SW}$  is at 400 km/s and then gradually increases to 470 km/s by the 8 h after the event.  $V_{SW}$  magnitudes are the highest for HFAE events, being 600–650 km/s throughout all the time interval. FE10k criterion events correspond to the largest, though smoothest changes in  $V_{SW}$  before and after the event: from 460 to 600 km/s.



**Figure 4.** Similar to Figure 3, superimposed epoch analysis for the variations of (a) Interplanetary magnetic field  $B_z$ , (b) Solar wind velocity, (c) Number density, and (d)  $E_y$  electric field at around the detected top 100 15-min-averaged worst-case severe environments for surface charging. Thick lines represent the median values at each 1-min time step and shaded area defines the interquartile range (25th–75th percentiles).

**Table 4**  
Parameter Changes With Time Before the Event/Relative Timing of Parameter Maximum Change and the Event/and After the Event

Criterion/ parameter	$\Delta Kp$	$\Delta AE$ , nT	$\Delta AL$ , nT	$\Delta SYM-H$ , nT	$\Delta IMF B_z$ , nT	$\Delta V_{sw}$ , km/s	$\Delta N_{sw}$ , $cm^{-3}$	$\Delta \langle V_{B_z} \rangle$ , mV/m
PG5k	No	300 in 1 h/max at/4 h	200 in 1.5 h/max at/1.5 h	No	No (2 1 h before)	No	No	1 in 8 h/ max 1 h before/4 h
LFHE	2 in 9 h/max at/12 h	600 in 8 h/max 1 h before/6 h	230 in 6 h/max 0.5 h before/3 h	30 in 4 h/max at/36 h	6 in 8 h/max 1 h before/5 h	50 grad. inc.	3 grad. inc./decr.	3 in 8 h/ max 1.5 h before/4 h
HFAE	No	400 in 1 h/max at/2 h	300 in 1 h/ max 20 min before/2 h	No	No (2 1 h before)	No	No	1 in 2 h/ max 1 h before/2 h
FE10k	2 in 6 h/max at/12 h	600 in 5 h/max at/3 h	450 in 5 h/max at/2 h	50 in 24 h/max 4 h after/>40 h	6 in 4 h/max 1 h before/4 h	100 grad. incr.	No	3 in 4 h/ max 1 h before/4 h

Similar to Figures 4a and 4b, Figure 4c shows the observed 5-min  $N_{sw}$  values for the four criteria. As in case of  $V_{sw}$ , PG5k and HFAE events are not associated with changes in  $N_{sw}$ ;  $N_{sw}$  is about 4–5  $cm^{-3}$  for PG5k and about 3  $cm^{-3}$  for HFAE criteria as seen in the median values. The interquartile range in  $N_{sw}$  is wider for the PG5k criterion 24 h before the event (3–8  $cm^{-3}$ ) and then narrows down to  $\pm 1$  from the median value at the event and 8 h after. For LFHE events,  $N_{sw}$  is elevated to 7  $cm^{-3}$  during 24 to 14 h before the event, then starts to increase gradually, reaches 9  $cm^{-3}$  at the event, and decreases to 6  $cm^{-3}$  8 h after the event. The interquartile range is wider than for PG5k and HFAE events being 6–14  $cm^{-3}$  at the event. In any case, there are no sharp variations in  $N_{sw}$ . During FE10k events,  $N_{sw}$  changes are also small,  $N_{sw}$  stay at 6  $cm^{-3}$  from 24 h right up to 1 h before the event, then increase slightly, and come back to the initial value.

Variations of the derived  $E_y$  presented in Figure 4d reflect very much of the variations in IMF  $B_z$  seen in Figure 4a. For all criteria,  $E_y$  has a peak right at about 1 h before the event. The smallest peak is observed during PG5k events, the sharpest—during FE10k events. Monotonic increase of  $E_y$  from 0 to 1 mV/m until 3 h before the event, then increase to about 3.5 mV/m in 2 h, and subsequent decrease back to initial magnitudes are typical characteristics of FE10k events. The interquartile range is 2–5 mV/m. During LFHE events,  $E_y$  stays at around 0 until about 8 h before the event, then starts to increase more gradually than during FE10k events, and reaches a peak median value of 3 mV/m. The  $E_y$  goes back to 0 values after the peak until 5 h after the event and then increases up to 1 mV/m. HFAE events correspond to a smaller peak in  $E_y$ ;  $E_y$  oscillates around 1 mV/m until about 2 h before the event and then increases by only 1 mV/m recovering in 3 h back to initial magnitudes. During PG5k events, the changes in  $E_y$  are very small: the  $E_y$  values lie between 0 and 1 mV/m and increase only up to 1.5 mV/m 1 h before the event.

### 4.3. Time History for Severe Environments for Surface Charging Dependent on Criteria Definitions

Similar to the results presented in previous sections, the time history of the parameters before, at, and after the events of severe environments for surface charging differs for different criteria definitions. Table 4 summarizes the noticeable parameter changes over time before the event (e.g., there is a 300 nT change in AE during 1 h before the event), the time when the maximal change (maximum or minimum) in the parameter occur relative to the time of the event (e.g., the AE peaks at the time of the event), and how many hours it takes for the parameter to recover to its initial magnitude (e.g., it take about 4 h for AE to recover) for the four criteria. All numbers refer to the median values seen in Figures 3 and 4.

For the PG5k criterion based on the spacecraft potential, no changes are seen in the  $Kp$  and SYM-H indices, solar wind velocity and number density. IMF  $B_z$  exhibits a small, rather questionable change of 2 nT during 1 h before the event and, as a consequence,  $E_y$  shows 1 mV/m change in 8 h before the event. The only noticeable change is in AE (and AL) with 300 nT in 1 h before the event (200 nT in 1.5 h for AL), and the peak in AE (and minimum drop in AL) occurred at the time of the event with fast recovery.

For the flux based LFHE criterion, all parameters change but on a longer time period, more than in 1 h before the event as seen in the PG5k criterion. The  $Kp$  index increases from 2 to 4 in 9 h before the event, reaching its maximum at the time of the event and slowly recovering in 12 h. AE (600 nT in 8 h) and AL (230 nT in 6 h) show gradual changes with no distinct peaks. The maximal change occurs 0.5–1 h before the event. Even more gradual changes are seen for  $V_{sw}$  (only 50 km 7s change) and  $N_{sw}$ . Sharp changes are present in SYM-H (30 nT in 4 h with maximum at the event with long recovery), but they

are not large. IMF  $B_z$  drops from 0 to  $-6$  nT in 8 h reaching minimum of  $-6$  nT 1 h before the event and so  $E_y$  has a peak 1.5 h before the event with 3 mV/m change from 0 in 8 h.

Behavior of the parameters during HFAE events is rather similar to the PG5k criterion. No changes can be seen for  $Kp$  and SYM-H indices, solar wind velocity, and number density with small changes in IMF  $B_z$  and  $\langle VB_s \rangle$ . Again, the only parameters with significant changes are AE and AL. They exhibit sharp changes of 300–400 nT in 1 h before the event with maximum change at the time of the event (20-min shift for AL) with fast recovery of 2 h.

Events with the last criterion, FE10k, are associated with significant changes in all parameters, except for  $V_{sw}$  and  $N_{sw}$ .  $Kp$  changes by two in 6 h, AE increases by 600 nT in 5 h, AE drops by 450 nT in 5 h, and they all have their maximal change at the time of the event. SYM-H shows a rather gradual decrease of 50 nT in 24 h with maximal drop 4 h after the event and long recovery. IMF  $B_z$  and  $E_y$  change by 6 nT and 3 mV/m, respectively, in 4 h reaching maximal change 1 h before the event.

Thus, based on the significance and timing of changes in the parameters before and at the events of severe environments for surface charging for different criteria definitions, we can summarize as follows:

1. No changes are seen in  $V_{sw}$  and  $N_{sw}$  for all four criteria.
2. A substorm-type pattern of the superimposed epoch AE (AL) dependencies for all criteria: 300–600 nT changes in AE (AL) are associated with the events for all four criteria with maximum change coinciding with the time of the event (gradual changes with maximum 1 h before the event for LFHE events).
3. A storm-type pattern of the superimposed epoch SYM-H dependencies for LFHE and FE10k criteria, not for PG5k and HFAE criteria: 30 nT sharp drop at the event for LFHE and gradual 50 nT drop 4 h after the event for FE10k.
4. The  $Kp$  index starts to increase 6–9 h before the event with the change of about 2 reaching maximum at the time of the event for 2 (LFHE and FE10k) out of 4 criteria.
5. Southward turning in IMF  $B_z$ : for LFHE and FE10k events, IMF  $B_z$  starts to decrease from being 0 and reaches maximum drop of 6 nT in 4–8 h at 1 h before the event occurring. Small changes of no more than 2 nT with maximum at 1 h before the event are seen for PG5k and HFAE events. Corresponding changes are evident in  $E_y$ .

AE and IMF  $B_z$  are the parameters with the most definite changes before and at the time of the events of worst-case severe environments for surface charging.

## 5. Discussion and Conclusions

The occurrences of 400 worst-case severe environments for surface charging observed by LANL satellites during the years of 1990–2005 were analyzed based on the definitions of four criteria for the worst-case severe environments developed by Matéo-Vélez et al. (2018) and the activity parameters with their time history, such as  $Kp$ , AE, AL, and SYM-H indices and IMF  $B_z$ , solar wind speed, proton number density, and derived electric field  $E_y$  and  $\langle VB_s \rangle$ . In addition to the occurrences (or numbers of events as histograms in Figures 1 and 2) of worst case severe environments, the normalized severe environment occurrence rate was introduced (shown as black dots with uncertainties in Figures 1 and 2). These normalized occurrence rates are the indicators of a risk to detect a top 100 worst-case severe environment event in a 15-min window for a given parameter bin.

For the  $Kp$  index to be considered as the main indicator of the probability for a satellite anomaly to be detected, no  $Kp$ -dependent high risk for worst-case severe environments for surface charging was found. During all events, the magnetosphere was moderately disturbed with  $Kp$  ranging from 3 to 5. This is in agreement with the previous studies by, for example, Choi et al. (2011), Thomsen et al. (2013), and Matéo-Vélez et al. (2018, 2019) (more citations can be found in Section 1), where it was stated that rather moderate  $Kp$  values were observed during the charging events. Charging events do not necessarily require high values of  $Kp$ .



The AE index was found to be a very special indicator of the highest risk for severe environments for surface charging to happen. Before and after the events in all criteria, the AE (AL) index shows a substorm-type pattern with max/min at the time of the event. This is in agreement with many previous studies relating the observed spacecraft anomalies with the presence of substorm activity. For example, Saiz et al. (2018) found that during the loss of Telstar 401 on January 11, 1997, the  $Kp$  index reached only 4, but a substorm occurred about 45 min before the anomaly (similarly to LFHE criteria). Iucci et al. (2005, 2006) have developed and analyzed the database of anomalies from Russian Kosmos satellites, which occurred during 1971–1997. Based on the dependence on the local time and AE index, they concluded that local-time dependent anomalies were due to 10–15 keV electrons injected into the magnetosphere as a result of auroral substorms. Loto'aniu et al. (2015) analyzed the space weather conditions at and around the time of the widely studied anomaly (Allen, 2010) at geosynchronous Galaxy 15 spacecraft at local midnight and concluded that the attributed onboard electrostatic discharge was due to the interactions of the spacecraft with substorm-injected energetic particles leading to spacecraft charging. At the same time, our analysis shows that the risk for severe environments for surface charging does not depend on the AE magnitude. The presence of substorm activity can tell us that the environment can be severe for surface charging to occur, but the surface charging will not depend on whether a substorm was moderate or intense.

Storm-type patterns of the SYM-H behavior during the events with LFHE and FE10k criteria based on low energy fluxes were obtained, but no high risk and no dependence on the strength of a storm were found related to the SYM-H index. Not many studies have attempted to relate the Dst index with the observed anomalies. One of them by Lohmeyer et al. (2012) correlated Inmarsat anomalies with only a  $-25$  nT drop in the Dst index. Most of the events in the present study which had relations to the SYM-H index occurred during main and recovery phases of small to moderate storms with SYM-H above  $-100$  nT. At the same time, many events occurred without any relation to any storm. Thus, there is no need for a storm of any strength to happen in order for a surface charging event to be detected.

If the detection of a severe environment for surface charging requires ongoing substorm activity, then AE (AL) index, but not  $Kp$  or SYM-H (Dst), is naturally best suited to characterize this environment. Related to that, it is also quite expected that superimposed epoch IMF  $B_z$  revealed the southward turning pattern 1 h before the events. The IMF  $B_z$  itself cannot serve as an indicator of a risk to have a severe environment. Siljanpää et al. (2017) conducted the analysis of GOES 13 MAGED data for 5 years (2011–2015) and developed an empirical model for the 40–150-keV electron fluxes at geostationary orbit. They found that 1.5 h delayed IMF  $B_z$  and  $V_{sw}$  are the driving parameters for the best correlation between the modeled and observed electron fluxes. Ganushkina et al. (2019) further confirmed this. Indeed, according to our present study,  $V_{sw}$  is related to the highest risk worst-case severe environments and this risk depends on the  $V_{sw}$  magnitude. The difference is that the time history of  $V_{sw}$  before and after the events in all four criteria for worst-case severe environments does not contain any significant variations. The event of worst-case severe environment is not related to  $V_{sw}$  sharp changes but it occurs when  $V_{sw}$  is elevated to 500–700 km/s for prolonged periods.

Saiz et al. (2018) reported that in the case of Telstar 401 anomaly, the most important parameters were large ( $>10$  nT) fluctuations of IMF  $B_y$  and high solar wind dynamic pressure (reaching 50 nPa). We included  $N_{sw}$  in the list of the studied parameters and found no risk associated with it and no changes in the time history of it.

Our last parameter is  $\langle VB_s \rangle$ , which has been used in modeling of low energy electron fluxes. For example, Denton et al. (2016) introduced the empirical model of the electron fluxes and ion fluxes at geosynchronous orbit as a function of local time, energy, and  $\langle VB_s \rangle$ . Stepanov et al. (2021) used THEMIS (The Time History of Events and Macroscale Interactions during Substorms) data set to investigate a relative importance of the various external driving parameters for the superthermal electron flux variations. The authors ranked solar wind reconnection electric field  $E_{kl}$  ( $E_{kl} = VB_{yz} \sin^2(\theta / 2)$ ) as the second (in its importance, after  $V_{sw}$ ) parameter controlling 10 keV electron flux. Obviously,  $\langle VB_s \rangle$  defines the risks for worst-case severe environments according to those of IMF  $B_z$  and  $V_{sw}$ .

Among four criteria for surface charging related, severe environments developed by Matéo-Vélez et al. (2018), LFHE and FE10k criteria based on the enhancements of low energy particle fluxes show definitely clearer dependencies on the solar wind and IMF parameters and geomagnetic activity indices



and distinct variations in the superimposed epoch patterns. LFHE is regarded as high fluxes of electrons with energies <50 keV and low fluxes for electrons with energies >200 keV. FE10k is related to the highest fluxes of electrons at energies above 10 keV. Low energy electrons vary significantly with the geomagnetic conditions (e.g., Ganushkina et al., 2013, 2019; Sillanpää et al., 2017). Therefore, there is no surprise that the occurrence of severe environment events classified as those two criteria exhibits more pronounced dependencies on the solar wind and IMF parameters and geomagnetic activity indices. At the same time, the similar dependencies are less obvious for the PG5k criterion based on spacecraft potential stressing again the absence of straightforward relations between the geomagnetic conditions and surface charging.

On the other hand, PG5k criterion is based on the duration of charging even though below extreme value (in contrast to other criteria which are based on peak values). It can be speculated that this specific feature could lead to the some kind of saturation seen in some figures (e.g., Figures 1a and 1b). If it is the case, the beginning of saturation corresponds to  $-5$  kV charging. In addition, since almost all top 100 PG5k events occurred in eclipse and LANL spacecraft spend relatively little time in eclipse, the events with extreme geomagnetical activity can be represented poorly in the data set. This could possibly make the dependence on activity less clear. It should be noted that absolute charging is different from differential charging. High absolute charging levels make charging risks higher but only if they are associated with high differential voltages. Too few spacecraft are equipped with sensors to allow assessing both at the same time. In the present study, we have looked at long duration charging events that could possibly lead also to high differential charging (PG5k) and on electron spectra that can produce both absolute and differential charging on the basis of particle-matter interactions.

In reality, there were many more events with severe environments detected by LANL satellites during 1990–2005 (Matéo-Vélez et al., 2018). One of the logical steps in continuation of the presented study would be an analysis using all data with a parameter above a given threshold. Such a threshold could be a potential below  $-100$  V, or a flux of >10-keV electrons above  $10^7 \text{ cm}^{-2} \text{ sec}^{-1} \text{ sr}^{-1} \text{ keV}^{-1}$ , etc. This analysis can verify the obtained conclusions.

Another useful study will be to perform similar as in the present study analysis by separating events outside and inside eclipse to get the events in PG5k criterion in eclipse and the events in PGXk criterion outside eclipse with X being a potential to be determined. For the Van Allen Probes data analysis, Matéo-Vélez et al. (2019) have used  $-100$  V for potential X. Criteria based on satellite potential could distinguish events with a potential exceeding a given potential (as, e.g.,  $-100$  V). In addition, sorting out events inside and outside eclipse would help to separate better the effect of photoemission from ambient plasma and geomagnetic conditions.

Keeping in mind the points discussed above, the conclusions are the followings:

1. Moderate to intense substorm activity with the AE index ranging from about 500 to 1,000 nT is present when severe environments are detected and time history of AE (AL) before and after events in all criteria exhibits a substorm-type pattern with max/min at the time of the event. The AE index determines the highest risk for severe environments for surface charging to happen, but this risk does not depend on the AE magnitude.
2.  $V_{sw}$  points directly to the highest risk dependent on the  $V_{sw}$  value to worst-case severe environments to happen. At the same time, no significant changes were seen in the time history of  $V_{sw}$  before and after the events in all four criteria, although  $V_{sw}$  values are elevated to 700 km/s for HFAE criterion.
3. Although no high risks for severe environments to occur related to the SYM-H index were found, a storm-type pattern of the superimposed epoch SYM-H for LFHE and FE10k low energy fluxes criteria was obtained, but the events were associated with main and recovery phases of small to moderate storms.
4. Worst-case severe environments for surface charging according to all four criteria occur when the  $Kp$  index shows moderate disturbance (3–5) but a high risk for them is not associated with the  $Kp$  index; changes in  $Kp$  index as increase in 6–9 h exist only before events defined by LFHE and FE10k criteria which are based on high fluxes of low energy electrons.
5. IMF  $B_z$  was found to be small and negative during the events in all criteria with superimposed epoch analysis revealing the southward turning pattern in IMF  $B_z$  for LFHE and FE10k events with maximum

- drop of  $-6$  nT 1 h before the event occurring and smaller changes for PG5k and HFAE events. There is no clear dependence of risk to have a severe environment on IMF  $B_z$ .
6. As expected, the risks and time history for  $\langle VB_s \rangle$  are determined by the risks and time history for IMF  $B_z$  and  $V_{sw}$ .
  7.  $N_{sw}$  was  $<5$   $cm^{-3}$  for all criteria except for LFHE when it was 2 times higher. No high risk was found to be associated with the  $N_{sw}$  but there exists a dependence on the  $N_{sw}$  magnitude for LFHE and FE10k criteria. No changes were seen in the time history of  $N_{sw}$ .

The conducted analysis demonstrated that events detected following two criteria, LFHE and FE10k, based on the enhancements of low energy particle fluxes are evidently different from other two (PG5k and HFAE) with larger magnitudes of the parameters and distinct patterns in the time history of them. It is necessary to stress that flux criteria are more easily generalized to non-LANL spacecraft whilst PG5k is uniquely determined by spacecraft materials, designs, and geometries.

### Data Availability Statement

For solar wind and IMF data, OMNIWeb (<http://omniweb.gsfc.nasa.gov/>) was used and geomagnetic indices were obtained from the World Data Center for Geomagnetism, Kyoto (<http://wdc.kugi.kyoto-u.ac.jp/wdc/Sec3.html>). A total of 400 events with dates and times of the worst-case severe environments for surface charging as observed by LANL satellites during the years of 1990–2005 can be found at <http://doi.org/10.5281/zenodo.4474594>. They have been made through CNES Research and Technology Program funding 2016–2017.

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