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## RESEARCH ARTICLE

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### Key Points:

- We quantify the atmospheric chemical response due to lightning-induced electron precipitation (LEP) using first-principles simulations
- The change in ozone concentration during one thunderstorm via LEP processes is comparable to other types of energetic particle precipitation
- The long-term global chemical effects produced by LEP events could be potentially important and need to be properly quantified

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## Chemical Response of the Upper Atmosphere Due to Lightning-Induced Electron Precipitation

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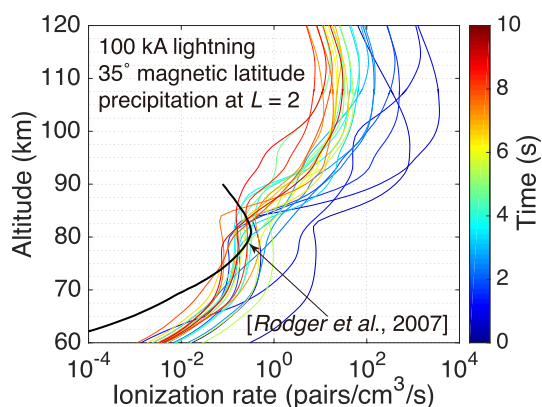
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**Abstract** Terrestrial lightning frequently serves as a loss mechanism for energetic electrons in the Van Allen radiation belts, leading to lightning-induced electron precipitation (LEP). Regardless of the specific causes, energetic electron precipitation from the radiation belts in general has a significant influence on the ozone concentration in the stratosphere and mesosphere. The atmospheric chemical effects induced by LEP have been previously investigated using subionospheric VLF measurements at Faraday station, Antarctica (65.25°S, 64.27°W,  $L = 2.45$ ). However, there exist large variations in the precipitation flux, ionization production, and occurrence rate of LEP events depending on the peak current of the parent lightning discharge, as well as the season, location, and intensity of the thunderstorm activity. These uncertainties motivate us to revisit the calculation of atmospheric chemical changes produced by LEP. In this study, we combine a well-validated LEP model and first-principles atmospheric chemical simulation, and investigate three intense storms in the year of 2013, 2015, and 2017 at the magnetic latitude of 50.9°, 32.1°, and 35.7°, respectively. Modeling results show that the LEP events in these storms can cumulatively drive significant changes in the  $\text{NO}_x$ ,  $\text{HO}_x$ , and  $\text{O}_x$  concentration in the mesosphere. These changes are as high as ~156%, ~66%, and ~5% at 75–85 km altitude, respectively, and comparable to the effects typically induced by other types of radiation belt electron precipitation events. Considering the high occurrence rate of thunderstorms around the globe, the long-term global chemical effects produced by LEP events need to be properly quantified.

## 1. Introduction

The concept of terrestrial lightning discharge as a loss mechanism for energetic electrons in the Van Allen radiation belts was first speculated by Dungey (1963), and later confirmed by direct measurements from the S81-1 (SEEP) satellite (Voss et al., 1984, 1998). This phenomenon is referred to as Lightning-induced Electron Precipitation (LEP), in which the Very-Low-Frequency (VLF, 3–30 kHz) waves emitted from a lightning discharge propagate in the whistler mode through the Earth's magnetosphere, scatter energetic electrons into lower mirroring altitudes in the radiation belts, and ultimately cause the precipitation of some trapped electrons into the upper atmosphere. As a strong coupling between the Earth's atmosphere and magnetosphere, LEP has been the main focus of various observational studies (e.g., Clilverd et al., 2002; Inan et al., 2010; Peter & Inan, 2007; Rodger, 2003) in the past few decades. Even long before the first spacecraft measurements, LEP has been investigated using radio measurements (Helliwell et al., 1973; Lohrey & Kaiser, 1979; Rycroft, 1973). The most effective approach of LEP observation is via the indirect measurements of ionospheric electron density enhancements using subionospheric VLF remote sensing. VLF waves radiated from the Naval transmitters are well trapped within the waveguide formed between the ground and the sharp boundary in the lower ionosphere, and thus particularly sensitive to the electron density in the D-region ionosphere (~60–90 km), a region that is frequently bombarded by LEP fluxes.

A major goal of previous and ongoing VLF observations is to estimate the size, fluxes, and spectra of LEP events, and thereby quantify the effects of terrestrial lightning on the radiation belt fluxes. Many of the pioneer works have been carried out by Inan et al. (1985); Inan and Carpenter (1986, 1987). The authors revealed that the phase and amplitude perturbations of VLF signals associated with LEP events (historically known as Trimpi events [Helliwell et al., 1973]), in most cases, can be explained using a whistler-induced precipitation flux ranging from  $10^{-4}$  to  $10^{-2}$  erg/cm<sup>2</sup>/s. Using simultaneous measurements from multiple ground receivers, the size of LEP events has been estimated, by Johnson et al. (1999) and Clilverd et al. (2002), to be as large as one thousand kilometers overhead the causative lightning discharge. Clilverd



**Figure 1.** Comparison of the ionization production by lightning-induced electron precipitation (LEP) between recent LEP modeling results (Marshall, Xu, Sousa, et al., 2019) using the wave-induced particle precipitation code (Bortnik, 2004; Lauben et al., 1999; Sousa, 2018) and the mean LEP ionization production (Rodger et al., 2005, 2007). The colored lines show the altitude profile of ionization production at  $L = 2$  by a lightning source with a peak current of 100 kA at  $35^\circ$  magnetic latitude.

et al. (2004) have further studied the relationship between VLF perturbations and the peak current of the source lightning flashes, and pointed out that the amplitude change of typical Trimp events is consistent with lightning peak currents of 70–250 kA. Rodger et al. (2005) have estimated the energy deposition via the LEP process into the middle atmosphere; a mean rate of energy deposition at  $L = 1.9$ – $3.5$  was found to be  $3 \times 10^{-4}$  erg/cm<sup>2</sup>/min, with highs of  $6 \times 10^{-3}$  ergs/cm<sup>2</sup>/min above North America. Studies using the Holographic Array for Ionospheric/Lightning Research (HAIL) found that, for a 100-kA lightning discharge, the peak flux of precipitation electrons is on the order of  $10^{-2}$  ergs/cm<sup>2</sup>/s (Peter & Inan, 2007). In general, the spatial scale of LEP ranges from several hundreds to one thousand kilometers, covering several degrees in latitude/longitude (e.g., Clilverd et al., 2002). As derived from ground VLF measurements, the displacement with respect to the lightning source is largely controlled by the geomagnetic field line, but primarily poleward shifted (e.g., Peter & Inan, 2007). Lightning-generated whistler waves can lead to precipitation of energetic electron from both the inner and outer radiation belts: LEP events have been found to play a significant role in electron losses in the inner radiation belt (e.g., Bortnik et al., 2006a, 2006b; Claudepierre et al., 2020a, 2020b); LEP can also lead to electron losses from the outer radiation belt, for example, Trimp events (Helliwell et al., 1973).

Due to the indirect relationship between VLF perturbations and the underlying D-region electron density variation, quantification of LEP fluxes using VLF measurements is by nature a nonlinear problem (Marshall, Xu, Kero, et al., 2019). The amplitude and phase changes of transmitter VLF signals are controlled not solely by the electron density enhancement, but also by the geometry of the transmitter-receiver path, the ambient ionosphere along the path (e.g., Xu et al., 2019), and the collision frequency profile driven by the background atmosphere (Marshall, 2012). As such, the LEP fluxes as inversely derived from VLF measurements are inherently ambiguous, with large uncertainties in the energy spectrum in particular. Besides VLF technique, LEP fluxes have been directly measured by in situ particle instruments, for example, the Solar Anomalous and Magnetospheric Particle Explorer (SAMPEX) (Blake et al., 2001) and the Detection of Electro-Magnetic Emissions Transmitted from Earthquake Regions (DEMETER) satellite (Inan et al., 2007). However, nearly all existing space-borne instruments can only resolve part of the loss cone angle (Marshall et al., 2020) and these measurements only provide a coarse estimate of the true precipitating flux.

Regardless of the specific causes, energetic electron precipitation (EEP) into the Earth's atmosphere, in general, has a significant influence on the ozone concentration in the upper atmosphere (e.g., Randall et al., 2007; Sinnhuber et al., 2012; Thorne, 1980) through the catalytic cycles of odd nitrogen ( $\text{NO}_x = [\text{N}] + [\text{NO}] + [\text{NO}_2]$ ) (Rusch et al., 1981) and odd hydrogen ( $[\text{HO}_x] = [\text{H}] + [\text{OH}] + [\text{HO}_2]$ ) (Solomon et al., 1981). Using 60 major EEP events measured during the solar cycle 23, Andersson, Verronen, Rodger, Clilverd, and Seppälä (2014) revealed that EEP strongly affects the ozone concentration and can cause up to 90% depletion at altitudes of 60–80 km. Turunen et al. (2016) have studied the chemical changes during a pulsating aurora event on November 17, 2012, and found a maximum reduction of 14% in ozone concentration at 75 km altitude. As for the chemical effects of LEP, Rodger et al. (2007) have performed detailed atmospheric chemistry simulations using the mean LEP energy flux reported in Rodger et al. (2005), but rescaled using the Trimp events observed at Faraday station, Antarctica ( $65.25^\circ\text{S}$ ,  $64.27^\circ\text{W}$ ,  $L = 2.45$ ) on April 14, 1994. The maximum changes in  $\text{NO}_x$  and  $\text{HO}_x$  concentration were found to be  $\sim 0.1\%$  around 80 km altitude, with a reduction of odd oxygen concentration by less than 0.1%, and thus the atmospheric chemistry effects were concluded to be insignificant (Rodger et al., 2007).

However, there exist large variations in the precipitation flux, ionization production, and occurrence rate of LEP events depending on the peak current of the parent lightning discharge, as well as the season, location, and intensity of thunderstorm activity (Sousa, 2018). For example, Figure 1 shows the comparison of ionization production between the mean LEP ionization production used by Rodger et al. (2005); Rodger et al. (2007), and our more recent LEP modeling results (Marshall, Xu, Sousa, et al., 2019). The colored

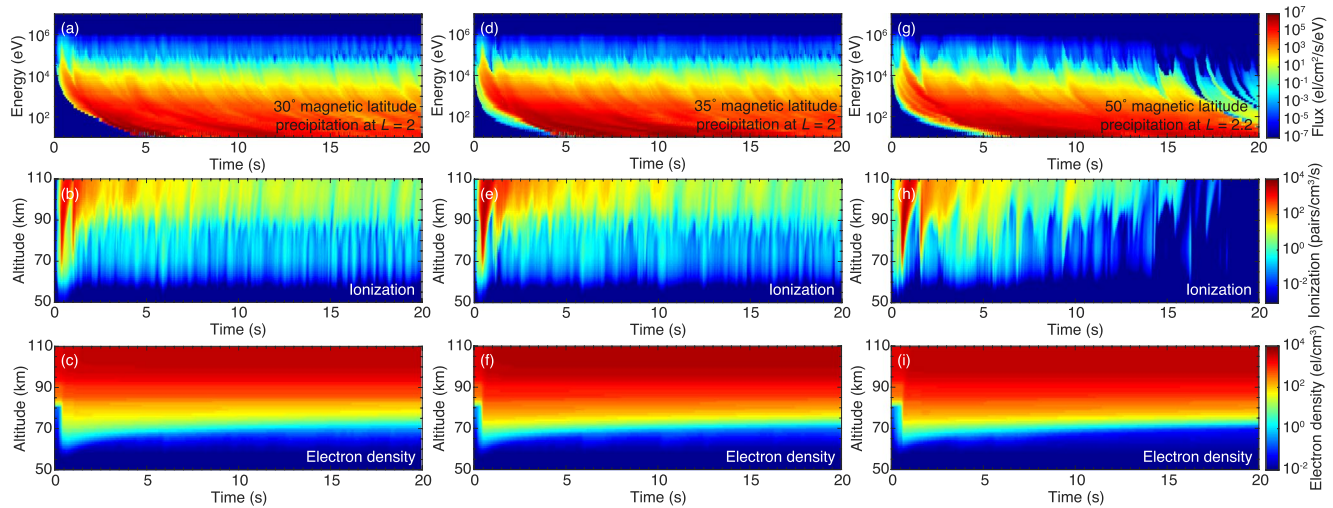
lines (color-coded using time) show the ionization rate versus altitude produced by an LEP event over the first 10 s after a 100-kA lightning discharge at 35° magnetic latitude, as calculated using the Stanford WIPP code (Bortnik, 2004; Golden et al., 2010; Lauben et al., 1999; Sousa, 2018). This code explicitly simulates from first principles the entire LEP process from the source lightning discharge to precipitation fluxes in the upper atmosphere. This model framework has been extensively used to analyze LEP-associated VLF measurements (e.g., Inan et al., 2010; Peter & Inan, 2007), and more recently calibrated using X-ray measurements by the Balloon Array for Radiation-belt Relativistic Electron Losses (BARREL) during possible LEP events (Marshall, Xu, Sousa, et al., 2019). In the first ~5 s, the mean LEP ionization production used by Rodger et al. (2007) (possibly corresponding to a peak current smaller than 100 kA) is on average one order of magnitude lower than that produced by this simulated 100-kA lightning discharge (Marshall, Xu, Sousa, et al., 2019).

Another parameter that is critical for LEP-induced chemical effects is the occurrence rate of intense lightning flashes. The flash rate was estimated to be approximately 3.3 events per minute for the Trimpi measurements at the Faraday station on April 14, 1994 (Rodger et al., 2007). A reexamination using the U.S. National Lightning Detection Network (NLDN) data (Cummins et al., 1998) reveals that this value is not representative of intense thunderstorms at lower latitudes. As will be shown in Section 3, the flash rate of lightning discharges with peak current larger than 50 kA could be as high as ~50 per minute, as observed during an intense thunderstorm occurring around 23.5°N, 97.5°W on October 25, 2015 (see Figure 3). In addition, the duration of a single LEP event was assumed to be ~0.2 s (Rodger et al., 2007) in the ducted case, whereas it can last up to 20 s or longer in the nonducted case (Bortnik, 2004; Marshall, Xu, Sousa, et al., 2019) due to multiple magnetospheric reflections between the conjugate hemispheres. Considering the high occurrence rate of LEP events (nearly once per minute globally) and potential chemical effects, the uncertainties in the LEP source (mostly from the uncertainties about the peak current of source lightning discharge, energy and pitch angle distribution of precipitation fluxes) motivate us to revisit the calculation of atmospheric chemical changes. In this paper, we present first-principles modeling results of LEP events, including the precipitation fluxes, ionization production, and chemical changes. We use three NLDN-reported intense storms as extreme examples to quantify the chemical effects produced by LEP.

## 2. Numerical Simulations

In this study, we combine the WIPP-LEP simulations of LEP (Bortnik, 2004; Lauben et al., 1999; Sousa, 2018), the Boulder Electron Radiation to Ionization (BERI) model (Xu et al., 2020), and the Sodankylä Ion and Neutral Chemistry (SIC) model (Turunen et al., 1996; Verronen et al., 2005), specifically in three steps. First, following the framework formulated by Lauben et al. (1999); Bortnik (2004), the WIPP model is employed to simulate LEP events produced by source lightning discharges at different magnetic latitudes and calculate the resultant precipitation fluxes at different observation locations ( $L$  values). Second, three intense storms are picked from the NLDN database for the years of 2013–2017 at the magnetic latitudes of 30°–50°. Using the WIPP results obtained in the first step, we calculate the total ionization production by the precipitation fluxes induced by all lightning flashes in these storms (denoted as the cumulative ionization production hereafter). Finally, the cumulative ionization production is utilized as an external forcing in SIC simulations in order to quantify the atmospheric changes to constituents of interest. Similar to previous EEP studies (Turunen et al., 1996, 2009), the main focus of this study is the relative change in the molecular concentration of odd hydrogen, odd nitrogen, and odd oxygen ( $[O_x] = [O] + [O_3]$ ). In the following, we introduce the numerical models and the initial parameters used in these simulations.

The WIPP code was built upon the modeling work of Inan (1977), and has been refined through the past three decades of LEP modeling work at Stanford by Lauben et al. (1999); Bortnik (2004); Golden et al. (2010); Cotts (2011); Sousa (2018). The details of this code, as well as the most recent updates, can be found in Sousa (2018). In short, a standard WIPP-LEP simulation includes four steps (Bortnik, 2004; Marshall, Xu, Sousa, et al., 2019; Sousa, 2018): (a) The electromagnetic pulse (EMP) energy emitted by the return stroke current of a lightning discharge is calculated and mapped to the base of the ionosphere at 100 km altitude, (b) We calculate the attenuation of lightning-emitted VLF waves during their propagation through the lossy ionosphere (100–1,000 km altitude) using the VLF attenuation curves (Graf, Spasojevic, et al., 2013; Helliwell, 1965), (c) Starting from 1,000 km altitude, we propagate each frequency component in the



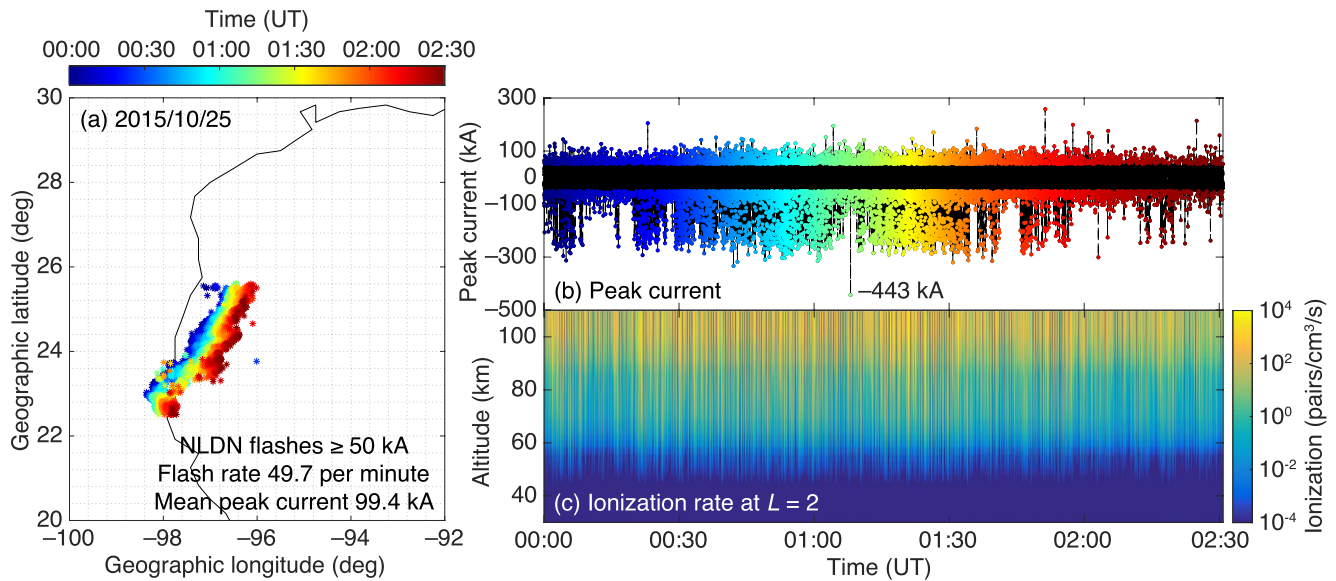
**Figure 2.** (a) Differential flux of precipitation electrons with energies between 10 eV and 10 MeV at  $L = 2$  due to a 100 kA lightning source at 30° magnetic latitude. (b) Ionization production at altitudes between 50 and 110 km by these precipitation electrons. The background atmospheric profile used in this ionization calculation is obtained using the date, latitude, and longitude of the 2015 storm reported by National Lightning Detection Network (see Section 3). (c) Electron density change in the D-region ionosphere produced by this lightning-induced electron precipitation event. Panels (d–f) show similar results, but for a lightning source at 35° magnetic latitude and precipitation fluxes at  $L = 2$ . Panels (g–i) show the results for a lightning source at 50° magnetic latitude and precipitation fluxes at  $L = 2.2$ . The background atmospheric profile used for the ionization calculation of panel (e and h) is obtained using the date and location of the 2017 and 2013 storm (see Section 3), respectively.

plasmasphere using the improved Stanford ray-tracing program (Bortnik et al., 2006a; Golden et al., 2010). Each ray is tracked through the plasmasphere for 20 s due to multiple magnetospheric reflections, (d) We calculate the resonant wave-particle interactions between these waves and the radiation belt fluxes, and mainly focus on the modification to the pitch angles of trapped electrons near the loss cone edge.

The fluxes and spectra of radiation belt electrons are calculated using the AE8 model (Vette, 1991) and their pitch angles are assumed to be sine-distributed between 0° and 90° (Marshall, Xu, Sousa, et al., 2019; Sousa, 2018). Note that precipitation fluxes are strongly dependent on the assumption of the background fluxes and pitch angle distributions; the most important part of pitch angle distribution is the region near the loss cone angle; the uncertainty brought by the assumption of pitch angle distribution has been previously discussed in Marshall, Xu, Sousa, et al. (2019); our results were validated using Van Allen Probes data, as reported in Marshall, Xu, Sousa, et al. (2019). WIPP simulations are performed for lightning discharges at magnetic latitudes between 15° and 55° with 5° steps. For each magnetic latitude, the differential fluxes of precipitation electrons with energies between 10 eV and 10 MeV are calculated for different observation locations ( $L$  values). To quantify the maximum chemical effects, the location with the highest precipitation flux (as denoted in the upper panels of Figure 2) is used to calculate the ionization production and resultant chemical changes. It is important to emphasize that in the WIPP simulations, the precipitation fluxes scale linearly with the total input EMP energy, which is proportional to the square of lightning peak current. Following this relation, WIPP-calculated LEP fluxes can be readily rescaled to the NLDN-reported peak current. This relation is close to that empirically determined by Clilverd et al. (2004), wherein the precipitation flux scales as the 2.3 power of lightning peak current.

Knowing the precipitation fluxes, we calculate the ionization production at altitudes below 150 km altitude (the upper boundary of the SIC model) using the BERI model (Xu et al., 2020). This model is largely based on a lookup table of atmospheric ionization production by monoenergetic electrons with energies between 3 keV and 33 MeV, and pitch angles between 0° and 90°. This lookup table was developed using physics-based Monte Carlo simulations (e.g., Lehtinen et al., 1999; Xu & Marshall, 2019), and allows rapid and accurate specification of ionization production by arbitrary precipitation energy and pitch angle distribution in any atmospheric condition. In this study, we assume that the precipitation electrons of each LEP burst at 500 km altitude are isotropically distributed in pitch angles between 0° and 90°. The mass density





**Figure 3.** National Lightning Detection Network (NLDN) measurements of lightning flashes between  $\sim 00:00$  and  $\sim 02:30$  UT on October 25, 2015 near  $23.5^\circ$  N,  $97.5^\circ$  W. (a) Longitude and latitude of all lightning flashes with peak current magnitude larger than 50 kA. The rate of lightning flashes with peak current magnitude larger than 50 kA is  $\sim 49.7$  flashes per minute and the average value of peak current for these flashes is  $\sim 99.4$  kA. (b) Peak current of lightning flashes versus the occurrence time. The largest peak current recorded by NLDN was  $-443$  kA at 01:08:08 UT. (c) Altitude profile of ionization production by the lightning flashes with peak current magnitude larger than 50 kA shown in panel (b).

profile of background atmosphere is calculated using the NRLMSISE-00 model (Tobiska & Bouwer, 2006) for the date, latitude, and longitude of the storms reported by NLDN (see Section 3).

Figure 2a shows WIPP modeling results of precipitation fluxes at  $L = 2$  produced by a 100-kA lightning discharge at the magnetic latitude of  $30^\circ$ . The two peaks at  $\sim 0.4$  s and  $\sim 1$  s, as typical of satellite measurements of LEP events (Voss et al., 1998), are caused by the interaction between radiation belt electrons and the initial upward-going whistler waves and the reflected whistler waves, respectively. The ionization production by these precipitation electrons at altitudes between 50 and 110 km is shown in Figure 2b. The background atmospheric profile used in this ionization calculation is obtained using the date, latitude, and longitude of the 2015 storm reported by NLDN (see Figure 3). Using a 5-species chemistry model (Glukhov et al., 1992; Lehtinen & Inan, 2007), we have further calculated the electron density change in the D-region ionosphere, as shown in Figure 2c. Figures 2d–2f show similar results, but for a lightning source at  $35^\circ$  magnetic latitude and precipitation fluxes at  $L = 2$ , while Figures 2g–2i show those for a lightning source at  $50^\circ$  magnetic latitude and precipitation fluxes at  $L = 2.2$ . The background atmospheric profile used for the calculation of Figures 2e and 2h is obtained using the date and location of the 2017 and 2013 storm (see Section 3), respectively. Of note, the electron density variations shown in the bottom panels of Figure 2 are capable of reproducing the typical amplitude changes ( $\sim 0.5$ – $2$  dB) of transmitter VLF signal during LEP events (Peter & Inan, 2007). Moreover, the peak precipitation flux produced by the lightning discharge at  $30^\circ$ ,  $35^\circ$ , and  $50^\circ$  latitude is 0.06, 0.14, and 0.15 ergs/cm<sup>2</sup>/s, somewhat higher but not unreasonably different from the values suggested by Peter and Inan (2007).

Because of the dense electron density in the D- and E-region ionosphere, the lightning EMP energy is severely attenuated during the daytime ionospheric conditions (Graf, Lehtinen, et al., 2013) and the resultant precipitation fluxes are considerably lower than nighttime (Sousa, 2018). Therefore, in this study, we mainly focus on those thunderstorms with high flash rates and large peak currents, occurring during local nighttime conditions. Given these criteria, three intense storms were chosen from the NLDN data for the years of 2013, 2015, and 2017 at the magnetic latitudes of  $50.9^\circ$ ,  $32.1^\circ$ , and  $35.7^\circ$ , respectively. The geolocation, temporal evolution, and peak current of lightning flashes in these storms are presented in Section 3.

The total ionization production during a thunderstorm is a key parameter in chemical simulations, and is calculated using all the flashes with peak current larger than 50 kA in the present study. A minimum value

of 50 kA is used since it is close to what is needed to trigger Trimpi events (70 kA) with detectable ionosphere enhancements (Clilverd et al., 2004). Clilverd et al. (2002) also noted that, if the lightning peak current is less than 45 kA, the chance of observing any Trimpi events is almost zero. We have checked that, if a lower threshold value is instead used, the cumulative ionization production would not change significantly since the LEP flux scales linearly with the square of lightning peak current. Specifically, for a given storm, we use the WIPP results at the corresponding magnetic latitude (upper panels of Figure 2) and rescale the ionization results (middle panels of Figure 2) using the peak current of all NLDN-reported lightning flashes ( $\geq 50$  kA). The rescaled ionization production is then sorted using the NLDN-tagged time of each flash (see Figure 3b). Finally, these ionization results are summed together and we calculate the cumulative ionization production versus altitude and time for each storm (see Figure 3c).

The cumulative ionization production is then used as an input into SIC chemistry simulations. SIC is a 1-D atmospheric model that dynamically solves for the concentration of 16 minor neutral species and 72 ionic species in the altitude range between 20 and 150 km with 1 km resolution (Turunen et al., 1996; Verronen, 2006; Verronen et al., 2005). Vertical motion of species is included as molecular and eddy diffusion, neglecting transport by prevailing neutral winds. The latest version of this model takes into account 389 ion-neutral and neutral-neutral reactions, and 2,523 ion-ion and electron-ion recombination reactions. The background profile of neutral density used in SIC modeling is obtained from the NRLMSISE-00 model (Tobiska & Bouwer, 2006) using the daily average values of solar radio flux ( $F_{10.7}$ ) and the geomagnetic activity index ( $A_p$ ). Note that horizontal mixing is not included in the 1-D SIC model; this effect will be investigated in our next-step study using global circulation simulations.

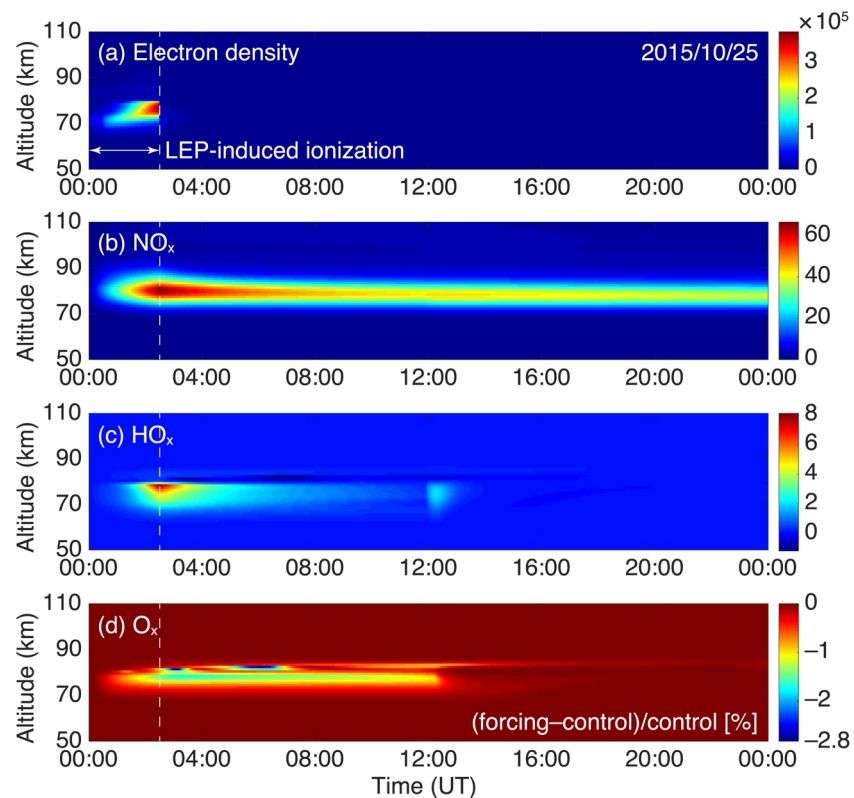
In this study, the neutral density profile is calculated using the specific date and location of each storm as reported by NLDN. Solar proton precipitation is provided as an optional external force in the SIC model, but not included in present simulations. The initial profiles of  $\text{HO}_x$ ,  $\text{NO}_x$ ,  $\text{O}_x$  are obtained by running the SIC model at the thunderstorm location for 5 days, prior to the LEP forcing with photoionization only. Chemical changes are simulated for a period of 24 h starting from the first LEP event and stored every 1 min of simulation. An average ionization rate of the event is used. Two sets of SIC simulations are performed for each storm, one with and another without the LEP-induced ionization production. The simulation results obtained without applying LEP ionization are regarded as the baseline, against which we compute the relative changes in neutral species and therefore quantify the chemical effects.

All above-mentioned numerical models have been well validated in previous studies. The WIPP code has been extensively used to interpret LEP-modulated VLF signals (e.g., Peter & Inan, 2007), and lately the X-ray fluxes recorded by BARREL during possible LEP events (Marshall, Xu, Sousa, et al., 2019). Different from VLF measurements, X-ray measurements at balloon altitudes are directly linked to the precipitation fluxes and energy spectra of LEP bursts; WIPP results can fully explain the X-ray fluxes, temporal signature, and energy spectra measured by BARREL (Marshall, Xu, Sousa, et al., 2019). As for the BERI model (Xu et al., 2020), it shows good agreements with the parameterization method of Fang et al. (2010) in terms of the peak ionization rate and altitude, with a maximum difference of  $\sim 20\%$  among tests using different precipitation energy and pitch angle distributions. The SIC model has been employed for the estimation of atmospheric chemical effects due to a wide variety of external sources, including radiation belt electron precipitation (e.g., Turunen et al., 2016; Xu et al., 2018), solar eclipse (e.g., Xu et al., 2019), and solar proton events (e.g., Clilverd et al., 2005).

### 3. Results

#### 3.1. Storm 1: October 25, 2015

The first storm in this case study occurred on October 25, 2015 at geographic latitudes between  $22.5^\circ\text{N}$  and  $25.6^\circ\text{N}$ , and geographic longitudes between  $96.0^\circ\text{W}$  and  $98.5^\circ\text{W}$ , along the Caribbean coast of Texas/Mexico. Figure 3a shows the longitudes and latitudes of all lightning flashes with peak current magnitude larger than 50 kA recorded by the NLDN network between  $\sim 00:00$  and  $\sim 02:30$  UT, with color progressing in time from blue to red. The peak current and occurrence time of these lightning flashes are shown separately in Figure 3b. The black and colored dots show the lightning flashes with peak current magnitude smaller and larger than 50 kA, respectively.

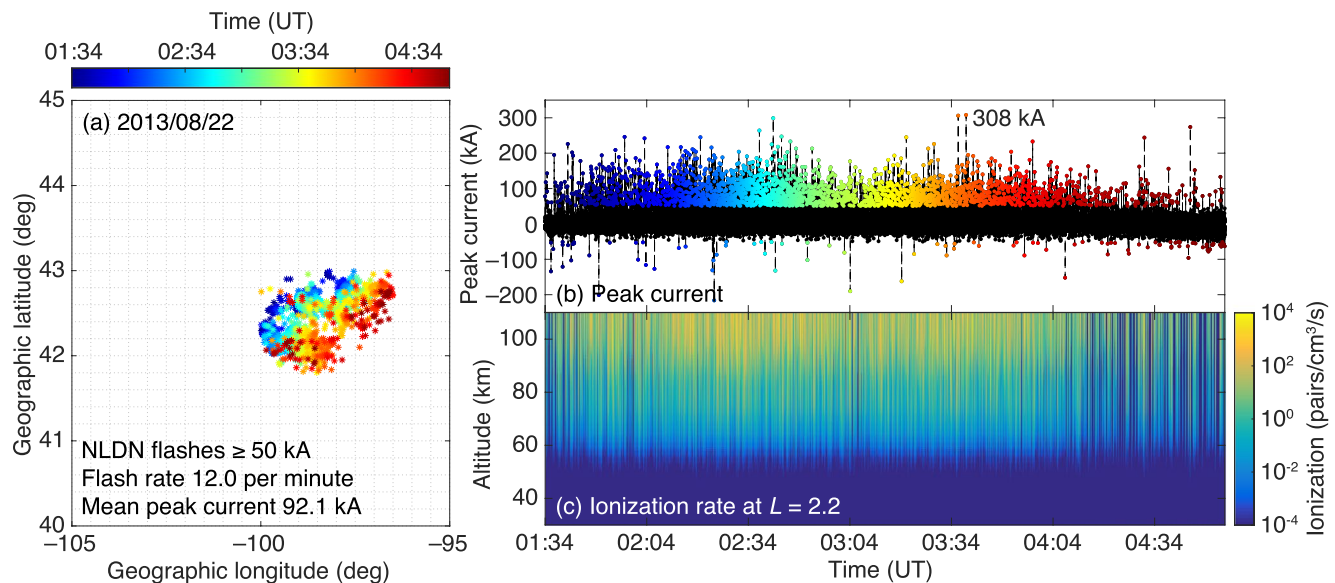


**Figure 4.** Sodankylä Ion and Neutral Chemistry modeling results of the relative changes in (a) electron, (b)  $\text{NO}_x$ , (c)  $\text{HO}_x$ , and (d)  $\text{O}_x$  concentration produced by all the LEP events in the 2015 storm. Sunrise time: 12:30:27 UT. This figure specifically shows the percentage difference between simulation results obtained with (denoted as forcing) and without (denoted as control) applying the cumulative ionization production (Figure 3c). The cumulative ionization production between 00:00 and 02:30 UT is marked using white dashed lines in these panels.

NLDN reported a total of 33,504 flashes from this region between 00:00 and 02:30 UT,  $\sim 22.3\%$  of which had peak current larger than 50 kA (7,453 flashes). The flash rate of intense lightning discharges ( $\geq 50$  kA) was approximately 49.7 per minute. The average value of the peak current for these 7,453 flashes was  $\sim 99.4$  kA and the majority were negative cloud-to-ground discharges. Out of the 33,504 flashes, the fraction of lightning flashes with peak current larger than 70 and 100 kA was approximately 11.2% (3,748 flashes) and 6.4% (2,157 flashes), respectively; the largest peak current was  $-443$  kA at 01:08:08 UT, likely associated with large-scale high-altitude luminous events, for example, elves (e.g., Marshall et al., 2010) or sprites (e.g., Pasko et al., 1997).

The magnetic latitude corresponding to the center of this storm is approximately  $32.1^\circ\text{N}$ , as calculated using the International Geomagnetic Reference Field (IGRF) model (Thébault et al., 2015). Thus, we use the WIPP-calculated precipitation fluxes produced by the lightning discharge at  $30^\circ$  magnetic latitude (Figures 2a and 2b) for the ionization calculation. The LEP-produced ionization profile in Figure 2b is rescaled using the peak current of the lightning flashes (colored dots with peak current  $\geq 50$  kA) shown in Figure 3b, sorted using the NLDN-tagged occurrence time (Figure 3b), and then summed together. Figure 3c shows the cumulative ionization production via all LEP processes during this 150-min storm.

These ionization results are then used as the forcing input to the SIC model in order to calculate the atmospheric chemistry response. Figure 4, from top to bottom, presents the relative change in the concentration of electrons,  $\text{NO}_x$ ,  $\text{HO}_x$ , and  $\text{O}_x$  produced by all the LEP events in storm 1. This figure specifically shows the percentage difference between the simulation results obtained with (denoted as forcing in Figure 4) and without (denoted as control in Figure 4) applying the cumulative ionization production during this storm ( $((\text{forcing} - \text{control})/\text{control}) \times 100 [\%]$ ). The cumulative ionization production between 00:00 and 02:30 UT is marked using white dashed lines in this figure. The electron density is dramatically enhanced, by three



**Figure 5.** Similar to Figure 3, but for the National Lightning Detection Network reported lightning flashes near 42.4°N, 98.7°W between 01:34 and 04:54 UT on August 22, 2013.

orders of magnitude in the D-region ionosphere, as seen in Figure 4a. This level of electron density change is close to previously reported results (e.g., Peter, 2007, Figure 5.2). The maximum change of  $\text{NO}_x$  concentration, due to the LEP-induced ionization, is approximately 67% at ~80 km altitude.  $\text{NO}_x$  is relatively stable and these changes can persist for a long time; about 37% of the excess  $\text{NO}_x$  production remains at the end of this 24-h simulation period (see Figure 4b).

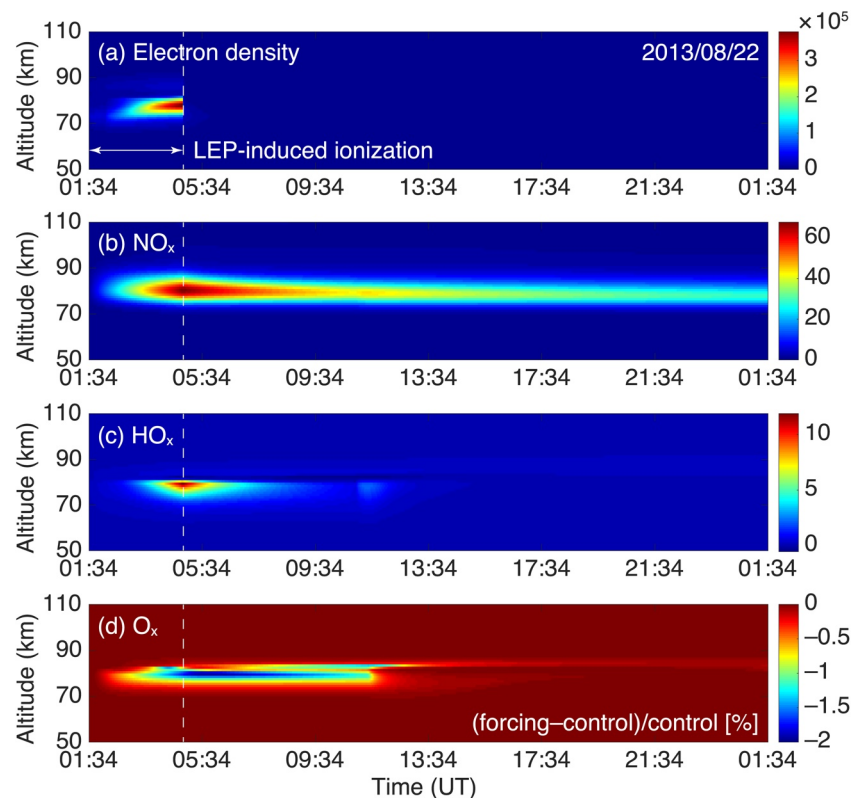
Different from  $\text{NO}_x$ , the  $\text{HO}_x$  change is considerably smaller and non-monotonic.  $\text{HO}_x$  concentration increases by ~8.1% at the altitudes near 78 km, and decreases by ~1.2% at 82 km altitude after the LEP forcing at ~06:52 UT. Above 82 km, the  $\text{HO}_x$  change is very small because of the limited abundance of water vapor in this altitude range (Turunen et al., 2016). A reduction of 2.8% is predicted for the  $\text{O}_x$  density around the local minimum in the mesospheric ozone profile, ~82 km altitude. However, because of the solar radiation and enhanced photochemistry during the sunrise (Verronen, 2006), the  $\text{HO}_x$  concentration is shortly enhanced (see Figure 4c) and the  $\text{O}_x$  concentration returns to the background value around ~12:00 UT (see Figure 4d).

### 3.2. Storm 2: August 22, 2013

Lightning at higher magnetic latitudes projects to higher  $L$ -shells in the radiation belts, and thus has the potential to impact fluxes in the heart of the radiation belts and produce more intense precipitation signatures. To investigate the LEP effects at higher latitudes, the second case study is performed for the thunderstorm occurring on August 22, 2013 at geographic latitudes between 41.8°N and 43.0°N, and longitudes between 96.5°W and 100.0°W, in northeastern Nebraska. Nebraska is well known for producing uncommonly intense positive lightning discharges (e.g., Stolzenburg, 1994). The magnetic latitude of this storm is ~50.9° N and the NLDN lightning data from 01:34 to 04:54 UT are used. Similar to Figure 3, Figure 5a shows the temporal evolution of lightning flashes with peak current magnitude larger than 50 kA and Figure 5b shows the peak current versus occurrence time for these flashes. The WIPP results corresponding to a lightning source at 50° magnetic latitude (Figure 2h) are utilized for the calculation of cumulative ionization production, as shown in Figure 5c.

Compared to the baseline runs, the relative change in  $\text{NO}_x$ ,  $\text{HO}_x$ , and  $\text{O}_x$  concentration is ~67%, ~12%, and ~2%, respectively, as shown in Figure 6. The  $\text{O}_x$  change in this case is smaller than that of the first storm, the  $\text{NO}_x$  change is comparable, and the  $\text{HO}_x$  change is slightly higher. Note that the relative change of these neutral species is somewhat sensitive to the baseline conditions, for example, the season, location,





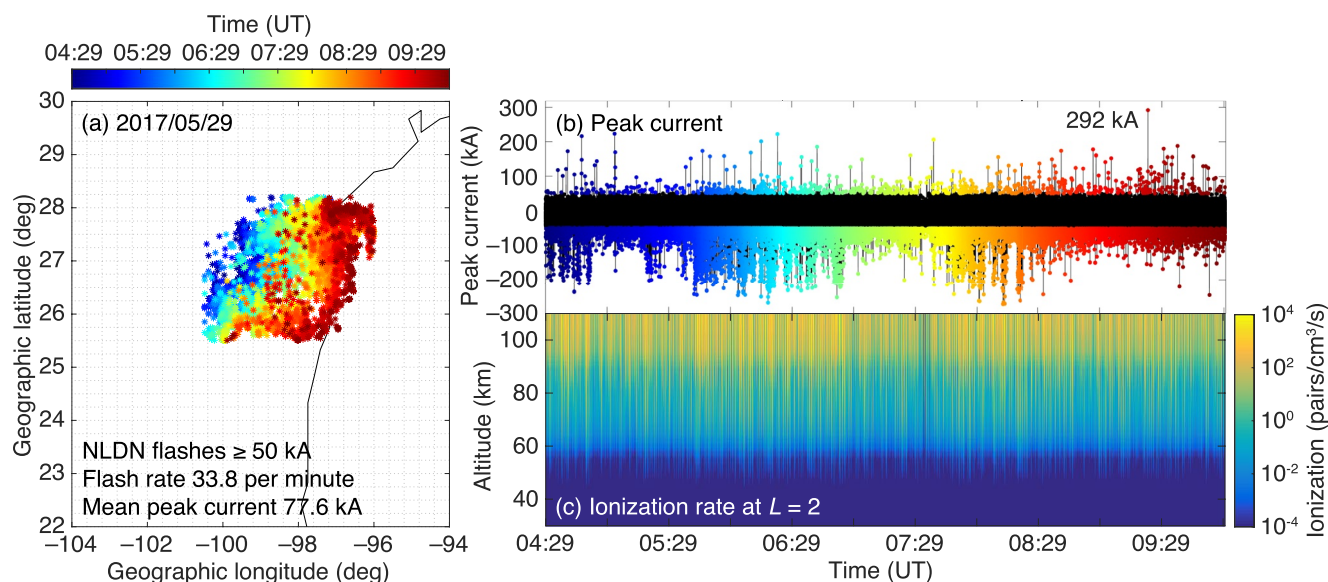
**Figure 6.** Similar to Figure 4, but for the National Lightning Detection Network reported lightning flashes near  $42.4^{\circ}$  N,  $98.7^{\circ}$  W between 01:34 and 04:54 UT on August 22, 2013. Sunrise time: 11:51:14 UT.

and background atmospheric condition of baseline simulations. On average, the cumulative ionization production in the second storm is notably less than that of the first storm since the peak current and flash rate are lower. In the second storm, 2,390 lightning flashes with peak current larger than 50 kA were detected by NLDN and the flash rate was  $\sim 12.0$  events per minute, a quarter of that for the first storm. The average value of peak current for these flashes ( $\geq 50$  kA) was  $\sim 92.1$  kA, which is also 7.3% lower than the first storm (99.4 kA). Out of these 2,390 flashes, the number of flashes with peak current larger than 70 and 100 kA was 1,585 and 775, respectively, and the largest peak current reported by NLDN was 308 kA.

Atmospheric chemical changes, in essence, are positively related with the cumulative ionization production during a thunderstorm for a given atmospheric condition, which is largely controlled by the LEP fluxes and lightning flash rate if the dependence on the precipitation energy spectrum is not considered. As explained in Section 2, the precipitation flux of a single LEP event is linearly proportional to the square of lightning peak current. The lightning flash rate can enhance or diminish the cumulative effects of ionization production during a thunderstorm. Thus, these two parameters can be roughly considered as a proxy for the extent of ionization and chemical effects produced by thunderstorm activity via LEP processes. It is important to note that the fluxes of LEP bursts are also dependent on the  $L$ -shell from which lightning whistler induces electron precipitation, that is, the availability of energetic electrons in the radiation belts, as well as their pitch angle distribution.

### 3.3. Storm 3: May 29, 2017

For the completeness of this case study, a third storm is chosen at a magnetic latitude between the first two storms, at  $\sim 35.7^{\circ}$  N. This storm took place on May 29, 2017 at geographic latitudes between  $25.5^{\circ}$  N and  $28.2^{\circ}$  N, and longitudes between  $96.0^{\circ}$  W and  $100.5^{\circ}$  W, near the U.S. and Mexico border along the Caribbean coast. The NLDN data between 04:29 and 09:59 UT are used for the chemistry simulation. The geolocation, peak current, and ionization production by the lightning flashes in this storm are shown in Figure 7. A total of



**Figure 7.** Similar to Figure 3, but for the National Lightning Detected Network reported lightning flashes near 27.3°N, 98.3°W between 04:29 and 09:59 UT on May 29, 2017.

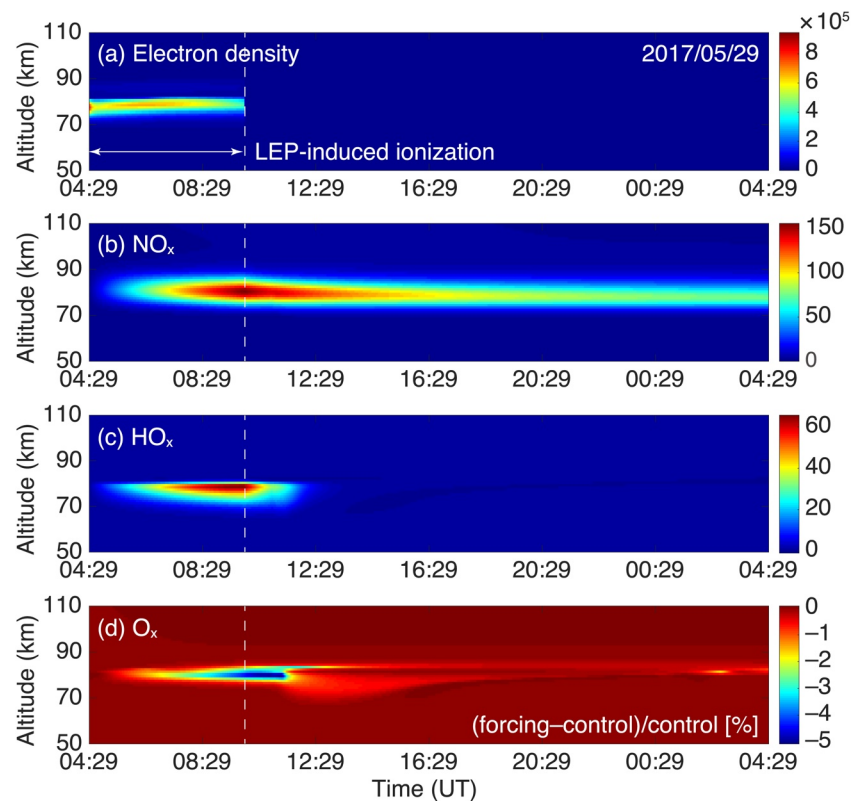
440,266 lightning flashes were identified by NLDN to originate from this storm, and the fraction of lightning discharges with peak current greater than 50 kA, 70 kA, and 100 kA was 2.5% (11,148 flashes), 0.9% (3,971 flashes), and 0.4% (1,753 flashes), respectively. These flashes were mostly negative cloud-to-ground discharges. The rate of lightning flashes with peak current larger than 50 kA was 33.8 flashes per minute, with the average value of the peak current (flashes  $\geq 50$  kA) being 77.6 kA and the largest value being 292 kA.

Given the NLDN-reported flash rate and peak current, it is not unexpected that this storm leads to the largest chemical changes among all cases, as evidenced in Figure 8. SIC modeling results show that LEP-induced ionization results in notable  $\text{NO}_x$  and  $\text{HO}_x$  changes: the  $\text{NO}_x$  concentration is more than doubled at altitudes between  $\sim 76$  and  $\sim 84$  km, with a maximum enhancement of 156% at  $\sim 80$  km; the  $\text{HO}_x$  concentration increases by  $\sim 66\%$  around 78 km altitude compared to the control runs. The  $\text{O}_x$  change in this case closely follows that of  $\text{HO}_x$ : at altitudes between  $\sim 77$  and  $\sim 83$  km, the  $\text{O}_x$  concentration reduces by more than  $\sim 3\%$  and the maximum reduction is approximately 5% at 79 km altitude.

#### 4. Conclusion and Discussion

In this study, using a suite of well-validated LEP and atmospheric ionization models, we have calculated the precipitation fluxes and ionization production by lightning flashes at different magnetic latitudes. We have performed case studies for three intense storms in the years from 2013 to 2017 at magnetic latitudes of  $30^\circ$ – $50^\circ$  using NLDN-reported lightning data. Using SIC modeling of atmospheric changes, we have further quantified the relative changes in the electron,  $\text{NO}_x$ ,  $\text{HO}_x$ , and  $\text{O}_x$  concentration due to the LEP events in these storms.

Because of LEP-induced ionization, the  $\text{NO}_x$  and  $\text{HO}_x$  concentration at altitudes between 75 and 85 km is enhanced by up to  $\sim 156\%$  and  $\sim 66\%$ , respectively, during these storms. The maximum reduction in ozone concentration is approximately 5%, as driven mostly by the catalytic reaction cycles of  $\text{HO}_x$ . These atmospheric changes are one order of magnitude larger than those suggested by Rodger et al. (2007), mainly because of the variation in lightning flash rate and thunderstorm intensity. The mean LEP ionization production used by Rodger et al. (2007) was calculated using a mean precipitation energy flux of  $2 \times 10^{-3}$  ergs/cm<sup>2</sup>/s (Rodger et al., 2005), as required to explain Faraday Trimp measurements. The chemical simulation of Rodger et al. (2007) was conducted using the Trimp events observed at the Faraday station on April 14, 1994, corresponding to a Trimp rate of 3.3 events per minute. However, as shown in Section 3, the



**Figure 8.** Similar to Figure 4, but for the National Lightning Detected Network reported lightning flashes near 27.3°N, 98.3°W between 04:29 and 09:59 UT on May 29, 2017. Sunrise time: 11:42:58 UT.

NLDN-reported lightning peak current and flash rate for the three storms reported herein are orders of magnitude higher.

The three storms investigated in this study do not represent the most intense cases on a global scale, albeit stronger than majority of the thunderstorm activity in North America. According to space-borne measurements of lightning activity, north and central Argentina is the region that hosts the most intense convective storms on the Earth (e.g., Houze et al., 2015). As outlined above, the atmospheric effects are positively related with the intensity of thunderstorm activity, and it is conceivable that the chemical effects of Argentinian storms could be even more dramatic. On the other hand, Argentinian storms occur at low magnetic latitudes, corresponding to the inner radiation belt, where the available fluxes of electrons for precipitation may be lower.

The main findings of our study are not contradictory to those of Rodger et al. (2007), but more complementary. The main difference between the ionization calculation of Rodger et al. (2007) and Marshall, Xu, Sousa, et al. (2019) is that Rodger et al. (2007) modeled LEP events in the ducted case, while Marshall, Xu, Sousa, et al. (2019) modeled the LEP process in the nonducted case due to multiple magnetospheric reflections; the energy and pitch angle distribution of LEP fluxes are different. The main focus of Rodger et al. (2007) is the average LEP effects produced by lightning discharge at high magnetic latitude, while this study mainly focuses on the LEP effects at relatively lower latitudes and in extreme cases, which have not been previously investigated. This study represents the first step of a series of studies toward better understanding on the atmospheric chemical effects brought by LEP. The main goal is to evaluate the immediate effects produced by LEP against other known ionization sources. The next-step study is to quantify the indirect effects produced by LEP events using a 3D global circulation model. Future studies can also aim at comparing the chemical effects reported in this study with ground- and/or space-based measurements.

A 5% ozone depletion at 75–85 km altitude is comparable to that produced by other EEP processes, for example, microburst precipitation (Seppälä et al., 2018), EMIC-driven electron precipitation (Hendry

et al., 2021), as well as pulsating auroras (Turunen et al., 2016). Compared to other types of energetic particle precipitation (EPP), a single LEP event is considerably shorter in duration and lower in precipitation fluxes. LEP produced by a 100-kA lightning discharge has a peak energy flux ranging from  $10^{-2}$  (Peter & Inan, 2007) to  $10^{-1}$  ergs/cm<sup>2</sup>/s (Marshall, Xu, Sousa, et al., 2019), while typical values for the precipitation flux associated with visible aurora are 0.1–10 ergs/cm<sup>2</sup>/s (Meng, 1976; Rees, 1992). Nevertheless, with thousands of lightning flashes repetitively occurring within a short time window of a few hours, that is, an intense thunderstorm, the cumulative effects are pronounced, and the ionization production and chemical changes become accordingly amplified.

An  $O_x$  change of several percent is more significant than it appears since the occurrence rate of LEP events globally is overwhelmingly higher than other EPP processes. The global lightning flash rate ranges from several tens to one hundred per second (Rakov, 2016), although not all flashes are sufficiently charged to give rise to radiation belt precipitation. Using Trimpi measurements, a representative value of the mean LEP rate at the Faraday station was found to be 0.79 per minute (Rodger et al., 2004). Rodger et al. (2003) have further estimated the global LEP rate using lightning observation data. An average value was suggested to be 0.18, 0.29, and 0.35 per minute at the  $L$  value of 2.4, 2, and 1.7, respectively. These values however, as noted by the authors, should only be considered as the lower bounds (Rodger et al., 2003) since not all LEP events cause significant VLF changes, due to the interference of waveguide modes and the nonlinear relation between the electron density enhancement and VLF perturbation.

As in the 1D chemical simulation, the ozone reduction is mainly due to the immediate effects of  $HO_x$  variation. Because of self-dissociation,  $HO_x$  has a relatively short lifetime and its effects on the ozone concentration are highly localized in space and time (Turunen et al., 2016). Andersson, Verronen, Rodger, Clilverd, and Wang (2014) have shown that the global distribution of nighttime OH is mostly influenced by EEP events at high latitudes, whereas lightning discharge and associated LEP event occur more frequently at low latitudes. As such, the ozone reduction due to  $HO_x$  changes produced by LEP events could be insignificant. Present results also show that, due to LEP ionization, the  $NO_x$  concentration could be enhanced by as high as ~156% in the mesosphere, but their effects on the ozone layer are not captured by the present chemistry simulation. In the context of LEP events, the  $NO_x$  effects could become even greater than what is predicted in the present study for a single thunderstorm if we take the global occurrence rate into account, although lightning activity tends to be more intense and frequent during summer times at low- and mid-latitude regions (Sousa, 2018). From this consideration, the long-term global chemical effects of LEP events may be potentially important, but have been largely overlooked in previous studies.

To quantify these effects, the ionization results presented in Figure 2 can be rescaled using the lightning peak current reported by real time lightning-monitoring network, for example, the World Wide Lightning Location Network (WWLLN) (Dowden et al., 2002). The lightning data can be converted into altitude profiles of ionization production by LEP events, and then incorporated into global atmospheric chemistry and transport models such as the Whole Atmosphere Community Climate Model (WACCM) (Verronen et al., 2016). Future studies can thereby take the latitudinal and seasonal variation of thunderstorm activity into account, and aim at assessing the long-term global chemical effects produced by LEPs.

## Data Availability Statement

The simulation data and analysis codes used to generate all figures and results in this study are available at <https://doi.org/10.5281/zenodo.4599480>.

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