Cold electron run-away below the friction curve G. Diniz^{1,2}, C. Rutjes², U. Ebert^{2,3}, I.S. Ferreira¹

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Abstract. Cold electron run-away means that free electrons in gases are accelerated from eV energies to energies above tens of keV by electric fields where they can be accelerated further. To run away, the electrons need to overcome a barrier at intermediate energies where they can lose much energy in collisions. When they have reached the run-away regime, they can produce high energy radiation by bremsstrahlung that can be detected as (terrestrial) gamma-ray flashes. When can thermal electrons from active discharges like streamers and leaders reach the run-away regime? The deterministic approach to this question is based on an energy dependent electron friction that has to be overcome by electric acceleration. Taking the stochastic nature of the electron molecule collisions into account, we find (1) that the classical friction curve in the energy regime up to 1 keV does not characterize the mean electron energy, but rather it seems to approximate the upper limit of the electron energy distribution, and (2) that electrons can "tunnel" through the barrier when the field close to 3 MV/m, below the socalled cold run-away threshold (or critical field) of approximately 26 MV/m in air at standard temperature and pressure. (3) This is only true in the bulk perspective where the electron liberation and attachment in a given electric field is taken into account in the refreshing electron ensemble. In a flux simulation that follows individual electrons as long as they are free, electron attachment reduces electron runaway very strongly in air, differently to what we observe in nitrogen.

Keypoints:

• We evaluate the stationary sub-keV electron energy distribution in air and nitrogen, in different electric fields.

• Friction is not a systematic approximation for the energy loss of non-relativistic electrons.

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• Cold electrons can accelerate to above 1 keV energy in electric fields close to 3 MV/m, well below the so-called run-away threshold.

1. Introduction

1.1. High energy atmospheric physics and electron run-way

Active thunderstorms by now are well-known to emit Terrestrial Gamma-ray Flashes (TGFs) [Fishman et al., 1994; Briggs et al., 2011; Østgaard et al., 2008] and gamma-ray glows [Adachi et al., 2008; Chilingarian et al., 2010, 2011; Tsuchiya et al., 2007], and these gamma-rays in turn create further particle species like electron positron beams [Briggs et al., 2011], neutrons [Babich et al., 2010; Bowers et al.], TGF afterglows [Rutjes et al., 2017; Enoto et al., 2017] and radioactive decay products of photonuclear reactions [Enoto et al., 2017]. The gamma-rays are due to the bremsstrahlung when high-energy electrons collide with air molecules. The whole chain of particle creation in high energy atmospheric physics therefore starts with these high energy electrons.

There are two basically different types of high energy electron sources in the atmosphere. The first type of sources are cosmic particles or radioactive decay, where the primary particles already have high energy. Cosmic particles impinge with high energy onto our atmosphere and create showers of more elementary particles and then secondary collision products. If the primary energy is as high as 10^{15} to 10^{17} eV, extensive air showers (EAS) can create substantial densities of secondary particles that can play a role in lightning inception [Dubinova et al., 2015]. Air showers can be enhanced by high electric fields in thunderstorms, creating Relativistic run-away Electron Avalanches (RREA) [Babich et al., 2005; Dwyer et al., 2008; Dwyer, 2007]. Radioactive decay of atmospheric components is another direct source of high energy particles [Enoto et al., 2017]. The second type of sources are low energy electrons (with energies in the eV range) that are accelerated in the fields of electric discharges like streamers or leaders into the so-called run-away regime

where they can keep accelerating when the acceleration in a local electric field is larger than the energy losses due to collisions with air molecules. To reach this regime, they have to pass through some intermediate energy regime where the dynamic friction due to collisions is larger. The present paper deals with this run-away process and the likelihood to pass through the friction barrier at intermediate energies towards run-away.

1.2. The concept of the friction curve

Electron run-away was first proposed by Wilson [1924] who suggested that thunderstorms could generate strong enough electric fields for electrons to continuously gain more energy than they lose through collisions with air molecules. This concept was further elaborated and quantified by *Gurevich et al.* [1992] who argued that the minimum of dynamic friction is at about 1 MeV electron energy in atmospheric air, and that an electric field above the threshold of 0.3 MV/m at standard temperature and pressure would maintain electron run-away at these energies. As discussed by Dwyer [2004], this dynamic friction curve for electrons with energies between 10 eV and 1 GeV can also be found in a report of the International Commission on Radiation Units and Measurements [ICRU 1984]. This is because dynamic friction acting on a particle is a common concept in high energy physics. E.g., a relativistic electron (with energy much above 1 MeV) on its path through matter loses energy mostly by creating many low energy particles while it essentially keeps its original direction; so it effectively loses energy continuously and experiences some friction force, known as a Continuous Slowing Down Approximation (CSDA), and it can be clearly distinguished by its high energy from the many liberated electrons in the eV regime. As discussed by *Ruties et al.* [2016], this approximation is improved in some high energy codes by including the generation of all secondary particles

below an energy threshold ε_{cut} into an effective friction force acting in the primary particle, while collisions where the primary particle loses more energy are treated explicitly and stochastically. In nuclear physics where one is interested in the thickness of some material needed to shield some particle radiation, the friction on the energetic particle is also called the stopping power of the material it penetrates.

While the friction concept is well based in high energy physics, Moss et al. [2006] have applied the concept to low energy electrons in the eV range as well, and, e.g., Colman et al. [2010] and Chanrion et al. [2016] use the same concept. Moss et al. [2006] define the dynamic friction force $F_D(\epsilon)$ of an electron with energy ϵ through the equation¹

$$F_D(\epsilon) = \sum_{i,j} N_i \ \sigma_{i,j}(\epsilon) \ \delta\epsilon_{i,j},\tag{1}$$

where N_i is the partial density of each air component *i* (nitrogen, oxygen, Argon etc.), $\sigma_{i,j}$ are the cross sections for an electron collision with a molecule of type *i* and collision type *j* (see Table 1), and $\delta \epsilon_{i,j}$ is the energy loss of the electron in the specific collision type. For an ionizing collision, the energy loss is the function $\delta \epsilon_{i,ion}(\epsilon)$ of the incident electron with energy ϵ is the ionization energy $\epsilon_{i,ion}$ plus the kinetic energy of the liberated second electron. In this case the average energy loss is calculated as

$$\delta \epsilon_{i,ion}(\epsilon) = \epsilon_{i,ion} + \frac{\bar{\epsilon}}{2 \arctan \frac{\epsilon - \epsilon_{ion}}{2\bar{\epsilon}}} \ln \left[1 + \left(\frac{\epsilon - \epsilon_{ion}}{2\bar{\epsilon}} \right)^2 \right], \tag{2}$$

where we used the empirical fit of *Opal et al.* [1971] with the constants $\bar{\epsilon} = 13.0$ eV for nitrogen and 17.5 eV for oxygen, and where we averaged over the energy distribution between the two outgoing electrons. Attachment cannot be taken into account in equation (1), as an attaching electron does not lose energy, but rather completely disappears from the ensemble. Also the second electron created in an impact ionization event cannot be $(\bar{c})2018$ American Geophysical Union. All Rights Reserved.

incorporated into a friction force. In this sense, the friction concept is a flux concept that characterizes the behavior of individual particles, but does not take the dynamical change of the particle ensemble into account.

The friction curve as defined above is shown in Figure 1 as a function of electron energy. Results for artificial air and for pure nitrogen at 273 K and 1 bar are shown. For the lowest energies, there are only rotationally excited states that cause little friction. The peaks in the range from 0.3 to 1 eV are due to the vibrational states of oxygen in air, and absent in pure nitrogen. The electronic excitations above 1 eV create a local maximum of the friction at about 2.5 eV and are quite similar in air and in nitrogen. Also the global maximum of the friction at about 200 eV is quite similar for the two gases. Beyond 200 eV the friction decreases towards the run-away regime.

1.3. Value and validity of the friction curve in different energy regimes

Moss et al. [2006] interpret their friction force by direct comparison with the electric force. Thus the net force on an electron is approximated as the electric force minus the friction force. This interpretation leads to the notion of equilibrium points, where the net force of field acceleration and friction vanishes. These equilibrium points can be dynamically stable or unstable. When the friction increases with increasing electron energy, the electron will be driven back to a stable equilibrium point, and one would therefore expect that this point characterizes the mean electron energy in the given electric field. On the other hand, if the friction decreases for increasing electron energy, the electron will move further away from the equilibrium point, and the point is unstable.

While this interpretation is correct for high energy electrons as they slow down almost continuously along a rather straight path as discussed above, it gives only a qualitative

insight for electrons in the eV range and can lead to erroneous conclusions. This is the topic of the present paper. The major short-comings of the deterministic friction approach in the eV regime are the following:

A. For a direct comparison between electric and friction forces, they need to be aligned which is often not the case, as we examplify below. The friction acts along any electron path, but electric acceleration acts only along the component of the path aligned with the electric field.

B. In particular, there is no energy loss related to elastic scattering, but the elastic scattering plays an important role in changing the propagation direction of the electrons and hence the energy gain from the electric field. This effect is ignored in Equation (1).

C. The collisions are discrete and stochastic; therefore there is no continuous energy loss, but rather there are discrete moments of time at which the electron loses a random amount of energy and attains a new random propagation direction.

D. The deterministic friction approach cannot account for electron attachment to oxygen or other electronegative gas components, or for electron multiplication by impact ionization. In this sense, it is a flux quantity, characterizing the evolution of an ensemble with a fixed number of electrons. We will see that attachment has an important effect in a flux ensemble when comparing air with pure nitrogen. However, we will show that this effect is supressed in a bulk ensemble where the electron number is changing continuously. Points A and B are well explored by *Chanrion et al.* [2016] and *Skeltved et al.* [2014].

Point C makes it possible for electrons to enter the run-away regime in electric fields below the maximum of the friction curve; since the energy gain is continuous and the energy loss is stochastic, there is a chance for the electrons to gain enough energy between

collisions to reach an energy region where the friction decreases. This is possibility, was already observed by *Li et al.* [2009]. We call this effect "tunneling through the friction curve".

Point D is here analyzed further, since the friction equation [Moss et al., 2006; Chanrion et al., 2016, 2014; Bakhov et al., 2000] cannot include electron attachment or liberation. As said above, based on the similarity of the friction curves for pure nitrogen and for artificial air shown in Figure 1, one would expect similar run-away probabilities in both gases, but in a flux ensemble this is not seen.

1.4. This work

We have analyzed the electron motion through air and pure nitrogen in a range of electric fields with a focus on the stochasticity of the collisions. To do so, we use a Monte Carlo approach with a previously developed code to study the equilibrium or steady state between electric and friction forces in an electron ensemble, exposed to constant electric fields in the range from 1 kV/m to 35 MV/m. We have also simulated the random motion of electrons starting with an energy of 200 eV in electric fields of 16 to 34 MV/m, and their chance to run away.

2. Methodology

2.1. Software framework

We have simulated electrons in air or nitrogen with the Particle in Cell (PIC) Monte Carlo code particle_core that is described in [*Teunissen and Ebert*, 2016] and available on github². The code follows the electron motion in a given electric field and their collisions with air molecules, where collision time and type are determined by a Monte Carlo pro-

cedure; hence the gas molecules are included as a random background of fixed density. The original code **particle_core** uses isotropic scattering of the electrons after collisions which is appropriate for electron energies up to the order of 20 eV, and the range of validity can be stretched by renormalizing the cross-sections; this is typically done for the cross-sections on the lxcat.net database³.

However, in order to study electron run-away, we have extended the code to 1 keV. Therefore we have modified the scattering model from an isotropic to an anisotropic algorithm as discussed below, and we have renormalized the elastic momentum transfer cross section according to *Li et al.* [2012]. The cross sections for nitrogen are from *Phelps* and *Pitchford* [1985] and the oxygen data are from the Phelps compilation available in the *lxcat data bank*. All collision types with their energy losses are summarized in Table 1, they include attachment, elastic, excitation and ionization collisions.

We use the empirical fit of *Opal et al.* [1971] for the distribution of the energy between the two outgoing electrons after an ionization collision. The electron scattering angles after ionization are calculated as by *Boeuf and Marode* [1982]. On the other hand, the scattering angle distribution of elastic and excitations collisions are the same and use the formula derived by *Okhrimovskyy et al.* [2002] for nitrogen and by *Surendra et al.* [1990] for oxygen.

2.2. Setup of simulations

We performed two types of simulations, one in the bulk and one in the flux perspective. The distinction between these different statistical ensembles for reactive plasmas is described for instance in [Blevin and Fletcher, 1984; Robson, 1991; Li et al., 2012]. This

distinction needs to be made here as well as free electrons appear and disappear during the discharge evolution.

Bulk: We studied an ensemble of electrons under the influence of a range of constant electric fields, i.e., we studied them in the bulk perspective [$Li \ et \ al.$, 2012] like an experiment does; the composition of the electron ensemble continuously changes as electrons are liberated by impact ionization and disappear due to attachment. The electrons started with vanishing energy, they accelerated initially, and then they converged in time to a stationary electron energy distribution. This analysis focusses on the energy distribution of the whole ensemble and allows to test the predictions of the deterministic friction curve concept.

Flux: Here we started with electrons with an initial energy of 200 eV aligned with the electric field and investigated how they evolved in different electric fields. Focussing on "single" electrons, this analysis is done in the flux perspective [Li et al., 2012], as needed in particle simulations. Differences between the electron behavior in air or pure nitrogen are highlighted by this setup, where we note significant differences in the probability of "tunneling" through the friction curve due to large energy fluctuations (see Figure 2) in combination with electron attachment to oxygen in air.

Both simulation types were performed without geometric boundary, in pure nitrogen or in a mixture of 80% nitrogen and 20% oxygen (artificial air), at a temperature of 273 K and a pressure of 1 bar.

The difference between bulk and flux perspectives highlights a possible source of error, if one does not pay attention on one's statistical framework, since both perspectives are valid

in different contexts. The flux perspective is what happens with the individual particle while the bulk perspective shows the collective behavior of the whole particle ensemble.

2.2.1. Bulk simulations

The bulk simulations were performed with 10^5 electrons with an initial energy of 0 eV in constant electric fields. The electron number in the ensemble was kept constant by adding an electron at random from the instantaneous electron ensemble after an attachment reaction and by removing a random electron from the ensemble after an ionization reaction; in this way the ensemble averages stay the same, the ensemble develops on its intrinsic time scales, but the particle number stays both numerically manageable and sufficiently large to allow good averaging. We covered the range from 1 kV/m to 35 MV/m of electric fields in order to cover the whole domain of the friction curve represented in Figure 1.

Our energy range is up to 1 keV, and electrons that reach 1 keV in this set up are removed from the simulation and a random particle is added just like after an attachment reaction. Since the energy of the added particle is randomly chosen from the instantaneous distribution, the distribution does not change. However, in high electric fields the ensemble of electrons below 200 eV is strongly coupled to the ensemble with higher energies, therefore our distibution shows artifacts due to the removal of electrons above 1 keV. This can be seen in Figure 3 where the mean electron energy stops to increase for electric fields above 10 MV/m.

We considered 200 different electric fields values equally spread on a logarithmic scale, and we let the simulations run until the electron ensemble reached steady state. After 4 ns or less we noticed no significant changes of the mean energy and its standard deviation

for all electric field values considered. And the standard deviation is always similar to the mean energy which reflects the broad energy distributions shown in the next section.

2.2.2. Flux simulations

The flux simulations start with 10⁶ electrons with 200 eV energy. The electrons were launched in the direction opposite to the field, so they gain maximal initial acceleration. We let the electrons evolve for 100 ns in constant electric fields between 16 and 34 MV/m. When the electrons reach 1 keV or attach to oxygen, they are flagged and not followed further. When an ionization reaction occurs, the electron with the higher energy is kept, while the other one is removed. In this manner, we focus on those electrons most likely to run away, i.e., on those that might "tunnel" through the friction barrier.

We compute the probability that an electron reaches 1 keV up to time t, by accumulating the number of all electrons that reach 1 keV up to that time, divided by the total number of initial electrons. In the same manner, we define the cumulative probability of attachment up to time t as the ratio of the total number of attachments up to time t over the total number of initial electrons.

Figure 2 shows the particle energy fluctuations in the flux simulation. The energy varies by almost 5 orders of magnitude due to high collision frequency and high electric field. The two different colors in the figure represent two different particles, and we see that one particle disappears after some time due to an attachment collision.

3. Results and discussion

3.1. Steady state electron energy distributions in different fields and the friction curve3.1.1. The electron energy distributions

The electron energy distributions in steady state as a function of applied electric field are displayed in Figure 3. To share the same field axis with all three panels, the field is plotted on the y-axis. It ranges from 1 kV/m to 35 MV/m which is well above the literature value for the electron run-away threshold of approximately 26 MV/m.

The left panel shows the mean electron energy in artificial air or pure nitrogen as a function of the electric field. The mean electron energy as a function of electric field is essentially the same for pure nitrogen or air, except for mean electron energies between 0.3 and 2 eV which correspond to electric fields between roughly 10^4 and 10^5 V/m (10 to 100 kV/m). There the mean electron energy in air is lower than in pure nitrogen. This effect can be attributed to electron energy losses due to the excitation of the vibrational states of oxygen, as also visible as the spikes around 1 eV of energy in the friction curve in Figure 1. The mean energy saturates when the electric field approaches 10^7 V/m. This is an artifact of the electron removal at 1 keV.

The middle and right panels show the electron energy distribution in air or nitrogen in color coding as a function of the electric field. The mean energy from the left panel is plotted as a dashed line in the middle and the right panel for the respective gas. Furthermore, the friction curves from Figure 1 are divided by the elementary charge and inserted as a white line in the panels for air or pure nitrogen. We will come back to this curve in the next subsection.

For better visualization of the data in Figure 3, we display the electron energy distributions in air for some selected electric fields between 180 kV/m and 4.27 MV/m in Figure 4. We note that as the electric field increases, the electron energy distribution shifts from a clear maximum below 2 eV to energies above 4 eV. A local minimum of the

energy distribution around 3 eV develops in this case that reflects the local maximum of the collisional energy losses due to electronic excitations. A similar observation has been made by *Colman et al.* [2010].

For electric fields above roughly 3 MV/m, the electron energy distribution is already non-zero up to electron energies of 1 keV. This means that electrons already have a non-vanishing probability to run away in such a field.

3.1.2. The relation to the friction curve

The friction curve from Figure 1 is inserted in the middle and the right panel of Figure 3 as a white line. If it were a systematic approximation, then for each electric field, the intersection of the horizontal line of constant field with the friction curve would define an equilibrium point at this field — as described in the introduction. So if friction curve and electric field would fully characterize the electron energy in a deterministic manner, the electron energy distributions should fully collapse onto the friction curves in Figure 3. But obviously that is not the case. And we already have identified the four short-comings A to D of this approximation in the introduction.

A further analysis of the middle and right panels of Figure 3 shows the following: For fields up to 10^4 V/m, the friction curve is far above a wide electron energy distribution. For electric fields between 10 kV/m and 1 MV/m, the friction curve in practice seems to mark the upper limit of the electron energy distribution, or the energy range where the distribution function decays steeply.

For a large range of electric fields, there are several intersections with the friction curve, i.e., a number of equilibrium points. In a purely deterministic setting, one would expect electron energies to be localized at the stable equilibrium points, but that is also not the

case. The small dip of the energy distribution at about 3 eV for 4.27 MV/m is a small indication for such behavior.

When there are several stable equilibrium points of the electron energies in a deterministic interpretation, there can be transitions between them. We call this a tunneling effect. (Of course, this tunneling is due to stochastic fluctuations, and not to quantum mechanics.) We observe a tunneling process in two different energy and field regimes: first at the electronic excitation peak at about 2 eV, where the electron energy distributions start to tunnel through the friction curve for electric fields of about 1 MV/m; secondly, at the ionization region above 10 eV for electric fields near the classical breakdown value of 3 MV/m.

We finally remark that the electron energy distributions of air and pure nitrogen are quite similar, despite their differences in electron attachment and vibrational excitations.

3.2. Electron run-away in electric fields below the run-away threshold3.2.1. An analysis in the flux perspective of single electrons

We now analyze the probability that an electron reaches the run-away regime as a function of the electric field when it starts out with an energy of 200 eV, and when it is optimally aligned with the electric field. This energy is chosen because the friction at this energy is maximal, see Figure 1. The electrons then have a high collision frequency and large energy losses per collision. The temporal evolution of the energy of two electrons starting with an energy of 200 eV in an electric field of 26 MV/m is shown in Figure 2.

A basic difference between air and pure nitrogen is that electrons in air can attach to oxygen. As they fluctuate through a large range of energies, electrons in air can reach energies where attachment is important, and and then they will disappear, as is also

illustrated in the right panel of Figure 2. In nitrogen this can not happen, and the probability that a given electron will run away is much larger.

This effect is quantified in Figure 5. The top panel shows the probability that an electron in air starts with 200 eV and attaches to oxygen up to time t. We can distinguish two different features: first, the probability of attachment reaches almost 100% after 0.1 μ s in all electric fields between 16 and 34 MV/m; second, the probability to attach diminishes with increasing electric fields. This is because the mean electron energy gain between collisions increases, and hence it is less likely that the electron will reach the low energies needed for attachment.

The bottom panel in Figure 5 shows the probability for an electron with initial 200 eV to reach 1 keV up to time t while it moves through air (dotted curves) or pure nitrogen (dashed curves). The colors of the lines indicate electric fields from 16 to 34 MV/m. Since nitrogen does not have attachment reactions, there is no sink mechanism for the electrons in the simulation, except that they are removed from the sample when they reach 1 keV, while electrons in air attach massively. Therefore single electrons in pure nitrogen reach 1 keV after maximally 100 ns with a probability of 50% in a field of 24 MV/m, while single electrons in air need more than 34 MV/m for a run-away probability above 50 %. In a field of 18 MV/m, single electrons in pure nitrogen already reach 1 keV within 100 ns with a probability of about 10^{-4} while in air they would need a field of 25 MV/m.

3.2.2. The bulk perspective on the electron ensemble

From the above analysis one might conclude that electron run-away is largely suppressed in an electronegative gas where electrons can attach. However, this is what happens in the flux perspective that focussed on the energy evolution of single electrons.

The energy fluctuations shown in Figure 2 indicate that electrons with initial energies as high as 200 eV play no very distinctive role in electron run-away, as they typically first explore a large range of lower energies before possibly running away.

In fact, Figure 3 clearly indicates that the electron energy distribution stretches to 1 keV for electric fields above 3 MV/m. This is the fact both for air and for pure nitrogen. The energy distribution of the whole electron ensemble is established collectively by all collision processes including electron loss due to attachment and electron gain due to impact ionization, and no major difference between air or pure nitrogen can be seen.

4. Conclusion

We have performed two different types of Monte Carlo simulations, both in pure nitrogen and in artificial air. In the bulk simulations, we have calculated the electron energy distributions of a dynamically changing electron ensemble in a wide range of electric fields. We have found that electrons can reach energies of 1 keV (which was the upper limit of the energies we explored) already in a field of about 3 MV/m, which is the classical break-down field.

We also have compared our results with predictions from the friction curve as calculated by *Moss et al.* [2006]. In the introduction, we have already discussed that friction is a valid concept at high (relativistic) energies, but that there are short-comings when applied below 1 keV: in particular, the non-alignment of electron motion and electric field, due to the random electron scattering directions after electron molecule collisions is not taken into account, also the energy loss is not a continuous friction process, but happens in discrete stochastic events. And the dynamic change of the electron ensemble cannot be included either. For this reason, the friction curve in the energy range below 1 keV does

not characterize the mean electron energies in a given electric field, but in practice it rather seems to act like the upper bound of a very broad electron energy distribution. Where the friction curve would predict the coexistence of two stable electron energies, the stochastic electron ensemble "tunnels" through the curve and creates a broad distribution. For the same reason, the maximum of the friction curve of 24 MeV/m is not a strict threshold to run-away, but electrons can reach energies of 1 keV in fields as low as 3 MV/m.

In a second Monte Carlo simulation, we have calculated the probability that a single electron starting with 200 eV reaches 1 keV or is being attached, in a range of electric fields. Here attachment is a major factor, and one might conclude that electron run-away below fields of 24 MV/m is suppressed by attachment in air, but not in pure nitrogen. However, this single electron (or flux) perspective does not represent the behavior of the whole reactive electron ensemble in the ensemble (or bulk) perspective of the first Monte Carlo experiment, as discussed above. This first experiment shows that the electron ensemble can "tunnel through the friction curve" for electric fields well below the runaway threshold, in a similar manner in air and in pure nitrogen.

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The data is displayed in the article, and the code can be accessed at https://github.com/jannisteunissen/particle_core.

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Notes

1. Here we correct some notation error of the original paper of *Moss et al.* [2006] as one needs to sum over two indices, one for the molecule species and one for the collision types.

2. https://github.com/jannisteunissen/particle_core

3. https://fr.lxcat.net/data/set_type.php

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Table 1.List of the electron-molecule interactions included in the simulations. Differentexcitation types of the molecules are indicated as rot for rotations, v for vibrations, and all othersymbols refer to electronic excitations, SUM is the sum over all singlet states. All cross section

data are retrieved from the lxcat databank and refer to Phelps' compilation of measurements.					
Result	Collision type	Energy loss $[eV]$	Result	Collision type	Energy loss $[eV]$
$\overline{N_2}$	Elastic	0	O_2	Elastic	0
$N_2(\mathrm{rot})$	Excitation	0.02	$O_2(\mathrm{rot})$	Excitation	0.02
$N_2(v1res)$	Excitation	0.29	$O_2(v1)$	Excitation	0.19
$N_2(v1)$	Excitation	0.291	$O_2(v1res)$	Excitation	0.19
$N_2(v2)$	Excitation	0.59	$O_2(v2)$	Excitation	0.38
$N_2(v3)$	Excitation	0.88	$O_2(v2res)$	Excitation	0.38
$N_2(v4)$	Excitation	1.17	$O_2(v3)$	Excitation	0.57
$N_2(v5)$	Excitation	1.47	$O_2(v4)$	Excitation	0.75
$N_2(v6)$	Excitation	1.76	$O_2(a1)$	Excitation	0.977
$N_2(v7)$	Excitation	2.06	$O_2(b1)$	Excitation	1.627
$N_2(v8)$	Excitation	2.35	$O_2(4.5 \text{eV})$	Excitation	4.5
$N_2(A3,v0-4)$	Excitation	6.17	$O_2(6.0 \mathrm{eV})$	Excitation	6
$N_2(A3, v5-9)$	Excitation	7	$O_2(8.4 {\rm eV})$	Excitation	8.4
$N_2(B3)$	Excitation	7.35	$O_2(9.97 \text{eV})$	Excitation	9.97
$N_2(W3)$	Excitation	7.36	O_2^+	Ionization	12.06 (Threshold ener
$N_2(A3,v10-)$	Excitation	7.8	O_{2}^{-}	3-body attach.	-
$N_2({ m B'3})$	Excitation	8.16	$O^{-}+O$	Dissoc. attach.	-
$N_2(a'1)$	Excitation	8.4	-	-	-
$N_2(a1)$	Excitation	8.55	-	-	-
$N_2(w1)$	Excitation	8.89	-	-	-
$N_2(C3)$	Excitation	11.03	-	-	-
$N_2(E3)$	Excitation	11.87	-	-	-
$N_2(a,1)$	Excitation	12.25	-	-	-
$N_2(SUM)$	Excitation	13	-	-	-
N_2^+	Ionization	15.6 (Threshold energy)	-	-	-

data are retrieved from the lxcat databank and refer to Phelps' compilation of measurements.

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Figure 1. The friction curve as function of electron energy in the range from 0.01 eV to 1 keV for artificial air (which is a mixture of 80% nitrogen with 20% oxygen, blue curve) and for pure nitrogen (red curve), calculated according to the definition of *Moss et al.* [2006], that is reproduced in equations (1) and (2). Both curves are calculated with the processes listed in Table 1, and for a density defined by 273 K and 1 bar. The electric forces on electrons in electric fields of 12 and 24 MV/m are indicated by horizontal dotted and dashed lines, respectively.



Figure 2. Statistical behaviour of the electron energies in air in the flux simulation: energy fluctuations of 2 electrons (red and blue) in a 26 MV/m electric field as a function of time; the left panel shows the time from 0 to 10 ps on linear scale, the right panel from 10 ps to 10 ns on logarithmic scale.

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Figure 3. Results of the bulk simulation for the steady-state electron energy distributions in constant electric fields ranging from 10^3 to 3.5×10^7 V/m (equivalent to 1 kV/m to 35 MV/m). Left panel: Mean electron energy as a function of the electric field for artificial air (blue) and for pure nitrogen (red). (The electric field is plotted on the y-axis and applies to all three panels.) Middle panel: Electron energy distribution in air in color coding as a function of the electric field. Right panel: The same as in the middle panel, but for pure nitrogen. The color code indicates the electron count per (logarithmic) energy bin, normalized by the total number of particles. The blue or red dashed lines in the middle and the right panel are the mean electron energies that are shown on the left panel as well. The white curves in the middle and the right panel are the respective friction curves from Figure 1 divided by the elementary charge, hence they have dimension of electric field and can be identified with the equilibrium points of the net force for each electric field, as discussed in the introduction.

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Figure 4. Selected electron energy distributions from Figure 3 for air. The legend displays the electric field in two different units, in MV/m for reference to the present results, and in Td for comparison with *Colman et al.* [2010].

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Figure 5. Results of the flux simulation for electrons starting with 200 eV in electric fields from 16 to 34 MV/m where lines of different color refer to different fields. Top panel: probability P(t) that an electron in air attaches to oxygen up to time t, as a function of time (for 10 ps to 100 ns). Bottom panel: probability P(t) that an electron in air (dotted lines) or pure nitrogen (dashed lines) reaches 1 keV, again as a function of field (color coded) and time. The numbers in the plots express the applied electric field in multiples of MV/m.

