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Title: Charging and Coagulation of Radioactive and Nonradioactive Particles in the Atmosphere Authors: Kim, Yong-ha; Yiacoumi, Sotira; Nenes, Athanasios; Tsouris, Costas

We appreciate the contribution of the Reviewers to improving the quality of our manuscript. Our responses follow the order of the comments provided by the Reviewers. Changes that have been made in the manuscript are described as part of the responses.

# <u>Reviewer 1</u>

1. This paper discusses the time-dependent change in size and charge distributions of particles. The text and figures comprise 45 pages, mostly of single-spaced text. This should make a nice paper if the authors can cut several pages from it. Given that the authors acknowledge on P. 23087 that "In our previous work (Kim et al., 2014, 2015) it has been shown that Approaches 1 and 3 can reliably simulate charging of radioactive particles. . ." there seems to be sufficient overlap with previous work to warrant reducing the size of this manuscript, including the number of figures, which stands at 16. Are all these figures really necessary to draw the conclusions about this paper? Some additional comments are given below.

<u>*Response*</u>: Following the Reviewer's suggestion, we moved three figures from the manuscript to the supporting information to reduce the length and improve the readability of the manuscript. These changes do not influence the conclusions of the manuscript.

Regarding the Reviewer's comment on overlapping with our previously published work, there is <u>no overlapping</u>. As shown on <u>lines 286-287 of the revised manuscript</u>, our previous work validated Approaches 1 and 3 in terms of simulating the charging of radioactive particles. The current work has only examined the validity of Approach 2 to model the charging of the particles.

2. Introduction. "Due to atmospheric dispersion, radioactive particles (e.g. 137Cs released during the Fukushima accident were sampled in situ 150 km away...)." 137Cs from Fukushima was found worldwide rather than just 150 km away (Figure 1 of Ten Hoeve and Jacobson, 2012).

<u>*Response*</u>: We agree with the opinion of the Reviewer. We have modified <u>lines 64 - 67 of the</u> revised manuscript as follows:

"For instance, due to these atmospheric dispersion patterns, radioactive particles (e.g., <sup>137</sup>Cs) released during the Fukushima accident were sampled in-situ 150 km away from the emission site (Yamauchi et al., 2012), and also found in many places around the world (Hoeve and Jacobson, 2012)."

3. Introduction. "Accurate understanding of the behavior of particles is necessary to predict transport of contaminants..." Please clarify. Do you mean "evolution of contaminants" or

# "removal of contaminants?" Transport of contaminants is dominated by wind speed and direction rather than the behavior of particles.

<u>*Response*</u>: We agree with the Reviewer that wind speed and direction can significantly influence transport of contaminants. In addition to wind, we believe that the deposition rates of particles can also highly affect the transport of contaminants because particle deposition, which is largely influenced by aerosol microphysics, can determine places where contaminant-laden particles are settled. To better explain this point, <u>lines 69 - 73</u> of the revised manuscript have been modified as follows:

"These examples suggest that particle deposition, which is largely affected by aerosol microphysics, can determine the fate of contaminants during atmospheric transport. Thus, accurate understanding of the microphysical behavior of atmospheric particles is necessary to more accurately predict transport of contaminants (especially long-lived ones, such as <sup>137</sup>Cs), as well as their potential environmental impacts."

4. Introduction. Please briefly explain self-charging and diffusion charging in the Introduction where it is first mentioned rather than in Section 2.2.

<u>*Response*</u>: We thank the Reviewer for the suggestion. The following sentences in the section "2.2. Charge balance models" have been moved to the section "1. Introduction" of the revised manuscript (lines 76 - 79).

"Self-charging refers to charge accumulation caused by radioactive decay which typically leads to emission of electrons from particle surfaces. Diffusion charging is attributed to diffusion of ions from the surrounding atmosphere onto the surface of particles."

5. Introduction. "Coagulation of atmospheric particles can influence their charging because the particle size distribution can highly affect the time-evolution of ion concentrations." This statement is very confusing. Do you mean, "Coagulation can affect the time evolution of the size distribution of ion concentration?"

<u>*Response*</u>: We thank the Reviewer for the comment. To better explain the meaning of the sentence, <u>lines 86 - 88</u> of the revised manuscript have been modified as follows:

"Coagulation of atmospheric particles can influence their charging because the concentration of atmospheric ions is affected by the particle size distribution (Yair and Levin, 1989), thereby modifying the diffusion charging rates of the particles."

6. Introduction: "Particle charging and coagulation can mutually affect each other..." Do you mean, "particle charging can affect coagulation rate coefficients and coagulation can affect the size distribution of charged particles?" If so, please clarify this statement. Please clarify when you refer to "charge" that you are not referring to van der Waal's forces, which result in particles being polarized but with zero net charge.

<u>*Response*</u>: We thank the Reviewer for the comment. <u>Lines 86-92</u> of the revised manuscript have been modified to better explain the meaning of the sentence. The revised text reads:

"Coagulation of atmospheric particles can influence their charging because the concentration of atmospheric ions is affected by the particle size distribution (Yair and Levin, 1989), thereby modifying the diffusion charging rates of the particles. Also, particle coagulation can result in charge neutralization or accumulation on atmospheric particles (Alonso et al., 1998). These effects imply that particle coagulation can influence the particle charge distribution. Thus, particle charging and coagulation can mutually affect each other and simultaneously affect both charge and size distributions in the atmosphere."

Also, the following text has been added to indicate that particle polarization is not included in this work (<u>lines 249-250</u> of the revised manuscript).

"In this work, polarization of particles is not taken into account."

7. Introduction. "Previous attempts to include charging effects include..." Please include Yu and Turco (2001). This and several other papers by Yu treated charging in the coagulation kernels in a sectional coagulation model. Following Equation 10, by "collision efficiency," do you mean "coalescence efficiency?"

<u>*Response*</u>: We thank the Reviewer for the suggestion and comment. A short description of the work of Yu and Turco (2001) has been added to <u>lines 113-114</u> of the revised manuscript. The coalescence efficiency is often called the collision efficiency (Jacobson, 2005; Seinfeld and Pandis, 2006). To avoid confusion, text has been added to <u>lines of 210 - 212</u> of the revised manuscript.

Jacobson, M. Z.: Fundamentals of atmospheric modeling, Cambridge University Press, New York, 2005.

- Seinfeld, J. H., and Pandis, S.N.: Atmospheric Chemistry and Physics: From Air Pollution to Climate Change, John Wiley and Sons, New Jersey, 2006.
- Yu, F., and Turco, R. P.: From molecular clusters to nanoparticles: Role of ambient ionization in tropospheric aerosol formation, J. Geophys. Res., 106, 4797-4814, doi: 10.1029/2000JD900539, 2001.

8. Also by "coagulation frequency," do you mean coagulation kernel or rate coefficient? Please provide units. F does not have units of frequency (s<sup>-1</sup>) but something like cm<sup>3</sup> per particle per second, analogous to a chemical reaction rate coefficient. Same thing with Beta in Equation 12.

<u>*Response*</u>: We thank the Reviewer for the comments. The coagulation frequency, F and collision frequency,  $\beta$  are also called the coagulation rate coefficient and the collision kernel, respectively (Jacobson, 2005; Seinfeld and Pandis, 2006). <u>Lines 191-192</u> and <u>205-206</u> of the manuscript have been modified to avoid confusion.

# **Reviewer 2**

1. In this work authors proposed three approaches for the description of charging and coagulation of radioactive and nonradioactive particles in atmosphere. The work is based on recent theoretical developments by Kim et al. (2014, 2015) in which, it was found that, electrostatic interactions caused by radioactivity can significantly modify the particle charge distribution. In the present work, mutual effects of charging and coagulation were examined. The applicability and accuracy of the new approaches depends on several factors, such as the size of particles and the initial conditions, while the computational cost may differ by  $\sim 2 - 3$  orders of magnitude from each other. The proposed approaches can be employed in various studies, such as, the influence of radionuclides on electrification phenomena in atmosphere.

Overall, I believe that the present work is of a good quality and it is suitable for publication. Apart few minor points described below, the manuscript is well written and reasoned. The analysis of the results is very detailed, while the limitations, accuracy, and the range of applicability of each approach has been carefully examined. Comparison of theoretical predictions with experimental results seems to validate the presented approaches.

<u>*Response*</u>: We thank the Reviewer for the overall positive evaluation of our manuscript, as well as for providing useful comments to improve the quality of this manuscript. Our specific responses to the concern raised by the Reviewer are given below, following the Reviewers' comments.

2. As a general comment, throughout text and in figures, particle sizes are expressed sometimes in micrometers ( $\mu m$ ) and some other times in nanometers (nm). For the readability of the paper, I believe that authors should decide to use consistently only one of the two units.

<u>*Response*</u>: We thank the Reviewer for the general comment. As suggested by the Reviewer, the manuscript has been revised with consistency in the units, to improve its readability. Specifically, we decided to use  $\mu$ m for particle size.

3. Symbol  $n_k$  first appearing in Eq.-7 has not been defined. Is it obtained from the decay rates  $n_{k,j}$  which was defined before? The same for symbols  $\beta_{k,j}^+$  and  $\beta_{k,j}^-$  in the same equation, which are different from  $\beta_{k,j}^+$  and  $\beta_{k,j}^-$  appearing before.

<u>*Response*</u>: We thank the Reviewer for pointing out it. The symbols, mentioned by the Reviewer as  $n_k$  and  $n_{k,j}$ , are actually the Greek letter  $\eta_k$  and  $\eta_{k,j}$ , respectively. Both symbols represent the radioactivity of particles. As written in <u>lines 133-134</u> of the revised manuscript, k and j are the indices of the size and number of elementary charges of particles, respectively. Thus,  $\eta_k$ represents the radioactivity of size k particles while  $\eta_{k,j}$  denotes that of size k particles with elementary charge j. To avoid confusion, we replaced the symbol  $\eta$  by A. Similar explanations are applicable to the symbols representing the ion-particle attachment coefficients,  $\beta_{k,j}^+$ ,  $\beta_{k,j}^-$ ,  $\beta_{k,j}^+$ , and  $\beta_{k,j}^-$ . The first 2 of these terms have low j as subscript, which is the number of elementary charges, while the last 2 terms have capital J as subscript which is the mean charge of particles. This distinction is made in the text on <u>line 161</u> of the revised manuscript.

4. In Eq.-10 in the definition of the time-evolution of particles, the symbol n(x, j) was picked to denote the number densities of particles. This may be confusing since the same symbol n has been used before to denote number concentration of charges. Using instead symbol N similar to Eq.-11 may be more clear.

<u>*Response*</u>: We thank the Reviewer for the comment and suggestion. In equations 1-9, "*n*" is only used to represent the concentrations of ions. We admit that n(x, j) is similar to some symbols to denote the ion concentrations such as  $n_+$ . Literature reports [e.g., Oron and Seinfield (1989)], however, show that n(x, j) typically represents the number density of particles while *N* normally denotes the concentration of particles in size bins. We believe that n(x, j) should not change. Alternatively, the symbols of the ion concentrations have been modified from  $n_+$ ,  $n_-$ , and  $n_0$  to  $n_{ion}^+$ ,  $n_{ion}^-$ , and  $n_{ion}^0$  in the revised manuscript to avoid confusion, respectively.

Oron, A., Seinfeld, J. H.: The dynamic behavior of charged aerosols: III. Simultaneous charging and coagulation, J. Colloid Interface Sci., 133, 80-90, doi:10.1016/0021-9797(89)90283-X, 1989.

5. In Eq.-11, the property distribution factor  $\eta_{l,m}$  has not been described. Also, it may be confusing that the same symbol was used before for the decay rate of the radioactive particles.

<u>*Response*</u>: Lines 202-203 of the revised manuscript has been modified to describe the property distribution factor. We agree with the Reviewer's opinion on the symbol of the particle decay rate. To avoid confusion, the radioactivity symbol,  $\eta$  has been changed to A in the revised manuscript.

6. Page 23805, Line 22-23: Equation numbers (in parentheses) used for each method seems to be redundant at this place since they have given in the previous paragraph just above.

<u>*Response*</u>: We thank the Reviewer for the comment. The equation numbers have been removed from the revised manuscript.

7. Page 23808, Line 22: No units are given for the diffusion charging rate.

<u>*Response*</u>: As pointed out by the Reviewer, the units of the diffusion charging rate have been added to <u>line 327</u> of the revised manuscript.

8. For the case of charging and coagulation kinetics of nonradiative particles, approach 1 was evaluated using the approximate analytical solutions suggested by Alonso (1999) (paragraph 3.2.1). I believe that the authors should shortly describe the previous approach and how it differs from the present one. At this end, it should become transparent the novelty of the present approach. Moreover, it should be clarified, why the results of the present approach are compared to the approximate analytical solution and not to the corresponding numerical solution of the rigorous population balance equations given by Alonso.

<u>*Response*</u>: We thank the Reviewer for the comments. Short descriptions of the work of Alonso et al. (1998) and Alonso (1999) are given in the section "1. Introduction." (<u>Lines 115-118</u> of the revised manuscript). To additionally explain the work of Alonso and his coworkers, text has been added to the section "3.2.1. Bivariate Population Balance Model for Approach 1(<u>lines 344 - 350</u> of the revised manuscript)."

Alonso (1999) found that results of the approximate analytical solutions are in good agreement with those of the numerical solution of the population balance equation of Alonso et al. (1998). This finding suggests that the analytical approach of Alonso (1999) may be useful to assess the validity of new numerical solutions. Thus, the comparison of results of Approach 1 with those of the numerical solution was omitted. Lines 344-352 of the revised manuscript have been modified to better explain this point. The revised text reads:

"Based on the numerical approach of Alonso et al.(1998), Alonso (1999) suggested an analytical approach to simultaneously investigate charging and coagulation kinetics of nonradioactive particles, smaller than 0.02  $\mu$ m in diameter. Results of the analytical approach agreed well with those of the numerical approach, but the applicability of both analytical approaches may be limited as discussed in section Introduction. The analytical approach, however, was found to be useful to validate numerical solutions of population balance equations including diffusion charging and coagulation (Alonso, 1999). In this study, the analytical approach of Alonso (1999) was used to evaluate Approach 1 because Approaches 2 and 3 are not applicable to particles smaller than 0.02  $\mu$ m, as shown in Figure 2a."

- Alonso, M., Hashimoto, T, Kousaka, Y., Higuchi, M., and Nomura, T.: Transient bipolar charging of a coagulating nanometer aerosol. J. Aerosol Sci., 29, 263-270, doi:10.1016/S0021-8502(97)10007-6, 1998.
- Alonso, M.: Simultaneous charging and Brownian coagulation of nanometre aerosol particles, J. Phys. A: Math. Gen., 32, 1313-1327, doi:10.1088/0305-4470/32/8/003, 1999.

1	Charging and Coagulation of Radioactive and Nonradioactive							
2	Particles in the Atmosphere							
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27	
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38	
39	ABSTRACT
40	Charging and coagulation influence one another and impact the particle charge and size
41	distributions in the atmosphere. However, few investigations to date have focused on the
42	coagulation kinetics of atmospheric particles accumulating charge. This study presents three
43	approaches to include mutual effects of charging and coagulation on the microphysical evolution
44	of atmospheric particles such as radioactive particles. The first approach employs ion balance,
45	charge balance, and a bivariate population balance model (PBM) to comprehensively calculate
46	both charge accumulation and coagulation rates of particles. The second approach involves a

47 much simpler description of charging, and uses a monovariate PBM and subsequent effects of 48 charge on particle coagulation. The third approach is further simplified assuming that particles 49 instantaneously reach their steady-state charge distributions. It is found that compared to the 50 other two approaches, the first approach can accurately predict time-dependent changes in the 51 size and charge distributions of particles over a wide size range covering from the free molecule 52 to continuum regimes. The other two approaches can reliably predict both charge accumulation 53 and coagulation rates for particles larger than about 0.04 micrometers and atmospherically 54 relevant conditions. These approaches are applied to investigate coagulation kinetics of particles 55 accumulating charge in a radioactive neutralizer, the urban atmosphere, and an atmospheric 56 system containing radioactive particles. Limitations of the approaches are discussed.

#### 58 1. INTRODUCTION

59 Atmospheric particles play an important role in airborne transport of contaminants, such as 60 radionuclides. Contaminants emitted from anthropogenic sources (e.g., nuclear plant accidents) 61 can be captured by background aerosols and then are transported together with pre-existing 62 particles. Contaminant-laden particles can be deposited onto the ground by dry and wet 63 deposition (primary contamination) and subsequently resuspended by wind or heat-driven 64 convection and moved to other areas (secondary contamination). For instance, due to these 65 atmospheric dispersion patterns, radioactive particles (e.g., <sup>137</sup>Cs) released during the Fukushima accident were sampled in-situ 150 km away from the emission site (Yamauchi et al., 2012), and 66 67 also found in many places around the world (Hoeve and Jacobson, 2012). Similar dispersion 68 patterns of radioactive particles were observed after the Chernobyl accident (Yoshenko et al., 69 2006a, 2006b). These examples suggest that particle deposition, which is largely affected by aerosol microphysics, can determine the fate of contaminants during atmospheric transport. Thus, 70 71 accurate understanding of the microphysical behavior of atmospheric particles is necessary to more accurately predict transport of contaminants (especially long-lived ones, such as <sup>137</sup>Cs), as 72 73 well as their potential environmental impacts. 74 The microphysical behavior of atmospheric particles is driven by such properties as charge and 75 size (Fuchs, 1989; Pruppacher and Klett, 1997). Atmospheric particles can acquire charge via 76 self-charging and diffusion charging. Self-charging refers to charge accumulation caused by 77 radioactive decay which typically leads to emission of electrons from particle surfaces. Diffusion 78 charging is attributed to diffusion of jons from the surrounding atmosphere onto the surface of

79 particles. Radioactive particles can be charged through these two charging mechanisms

80	(Greenfield, 1956; Yeh et al., 1976; Clement and Harrison, 1992; Clement et al., 1995;
81	Gensdarmes et al., 2001; Walker et al., 2010; Kweon et al., 2013; Kim et al., 2014; 2015) while
82	natural atmospheric particles are typically charged by diffusion charging (Hoppel, 1985; Yair
83	and Levin, 1989; Renard et al., 2013). Particle charging can modify not only the charge but also
84	the size distribution because charge on the particles modifies their coagulation rate coefficients
85	by generating electrostatic interactions (Fuchs, 1989; Tsouris et al., 1995; Chin et al., 1998).
86	Coagulation of atmospheric particles can influence their charging because the concentration of
87	atmospheric ions is affected by the particle size distribution (Yair and Levin, 1989), thereby
88	modifying the diffusion charging rates of the particles. Also, particle coagulation can result in
89	charge neutralization or accumulation on atmospheric particles (Alonso et al., 1998). These
90	effects imply that particle coagulation can influence the particle charge distribution. Thus,
91	particle charging and coagulation can mutually affect each other and simultaneously affect both

92 charge and size distributions in the atmosphere.

93 Theoretical and experimental investigations have been performed to examine the charging of 94 radioactive particles and background aerosols in the atmosphere. However, the effects of 95 coagulation of particles on the charge distribution have been frequently neglected by assuming 96 that the size distribution is constant while they are charged (Greenfield, 1956; Hoppel, 1985; 97 Yair and Levin, 1989). The assumption may be valid if the particle concentration is low or the 98 steady-state charge distribution is instantaneously attained (Hoppel, 1985; Renard et al., 2013; 99 Kim et al., 2015). If the timescale for particle charging is longer than that for particle coagulation, 100 the assumption may no longer be valid (Yair and Levin, 1989). Also, the effects of charging on 101 the particle size distribution are frequently neglected in aerosol transport models involving 102 microphysics of atmospheric particles. A possible reason for neglecting the charging effects may

103	be that the steady-state mean charge of atmospheric particles rarely may affect their coagulation
104	rates (Seinfeld and Pandis, 2006). However, neglecting electrostatic particle-particle interactions
105	may increase uncertainty of prediction results if particles can acquire multiple elementary
106	charges (e.g., radioactive particles). The simplified assumption of omitting electrostatic particle
107	interactions may create uncertainty in transport predictions of radioactive particles. Hence, it
108	may be necessary to take into account the mutual effects of particle charging and coagulation
109	processes in predicting the behavior of atmospheric particles carrying radioactive contaminants.
110	Previous attempts to consider charging effects include Oron and Seinfeld (1989a, 1989b), who
111	developed sectional approaches to simultaneously predict the behavior of charged and uncharged
112	atmospheric particles. Laakso et al. (2002) developed a general dynamic equation, including
113	charging and coagulation kinetics of atmospheric particles. Yu and Turco (2001) presented a
114	kinetic approach that involves diffusion charging and particle coagulation. However, the validity
115	of these approaches was not evaluated using analytical solutions. Alonso (1999) and Alonso et al.
116	(1998) developed analytical and numerical approaches to estimate time-dependent changes in the
117	size distributions of singly charged and neutral particles; thus, these approaches cannot be used
118	to investigate the coagulation kinetics of particles acquiring multiple elementary charges. Also,
119	none of these approaches considered self-charging; therefore, the aforementioned approaches
120	may be subject to error when they are used to simulate atmospheric dispersion of radioactive
121	plumes.

Our study presents three approaches to simultaneously predict time-dependent changes of the
charge and size distributions of radioactive and nonradioactive particles over a wide size range.
Development, validity, application, and limitations of these approaches are discussed.

#### 125 2. MODEL DEVELOPMENT

## 126 2.1. Ion balance model

Many atmospheric processes can generate and remove ions in air. Typical ion sources in the atmosphere involve natural and artificial radioactivity, as well as cosmic rays. Ions are generally removed by ion-ion recombination and ion-particle attachment. Changes in ion concentrations by these processes can be given by (Kim et al., 2015):

131 
$$\frac{dn_{\text{ion}}^{+}}{dt} = -n_{\text{ion}}^{+} \sum_{k} \sum_{j} \beta_{k,j}^{+} N_{k,j} - \alpha_{rc} n_{\text{ion}}^{+} n_{\text{ion}}^{-} + q , \qquad (1)$$

132 
$$\frac{dn_{\rm ion}^-}{dt} = -n_{\rm ion}^- \sum_k \sum_j \beta_{k,j}^- N_{k,j} - \alpha_{rc} n_{\rm ion}^+ n_{\rm ion}^- + q + q_e, \qquad (2)$$

133 where  $n_{ion}^{\pm}$  refers to the number concentrations of positive or negative ions, the indices *k* and *j* 134 represent the size and number of elementary charges of particles, respectively,  $\beta_{k,j}^{\pm}$  is the 135 attachment coefficient between a particle and an ion,  $N_{k,j}$  is the number concentration of particles, 136  $\alpha_{rc}$  is the recombination coefficient of ions, and *t* is time. The first two terms of the right-hand-137 side (RHS) of equations 1 and 2 represent the loss rate of ions due to ion-particle attachment and 138 ion-ion recombination, respectively. The third term denotes the production rate of ion pairs, *q*:

$$139 \qquad q = q_b + q_I, \tag{3}$$

140 where  $q_b$  is the ion production rate by cosmic rays and natural radioactivity, and  $q_l$  is the ion 141 production rate by radionuclides released by nuclear events. Electrons released by radioactive 142 decay are taken into account via the last term of eq 2. Changes in the ion concentrations may 143 affect the electrical conductivity of the atmosphere,  $\sigma_{air}$  (Harrison and Carslaw, 2003):

144 
$$\sigma_{\rm air} = e \left( \mu_+ n_{\rm ion}^+ + \mu_- n_{\rm ion}^- \right),$$
 (4)

145 where *e* is the electrical charge and  $\mu_{\pm}$  is the mobility of positive or negative ions. In eq 4, the 146 terms in the parentheses of the RHS represent polar air conductivities.

147

148 2.2. Charge balance models

Self-charging generally accumulates positive charge on the surface of particles, while diffusion charging adds both positive and negative charges, indicating that the charging mechanisms can compete with one another. For radioactive particles involved in beta decay, time-dependent changes in their charge distributions due to competition of the charging mechanisms can be expressed by (Clement and Harrison, 1992; Kim et al., 2015):

154 
$$\frac{dN_{kj}}{dt} = A_{k,j-1}N_{k,j-1} - A_{k,j}N_{k,j} + \beta_{k,j-1}^{+}n_{\text{ion}}^{+}N_{k,j-1} - \beta_{k,j}^{+}n_{\text{ion}}^{+}N_{k,j} + \beta_{k,j+1}^{-}n_{\text{ion}}^{-}N_{k,j+1}, \qquad (5)$$
$$-\beta_{k,j}^{-}n_{\text{ion}}^{-}N_{k,j}$$

where *A* is the radioactivity of the radioactive particles. In eq 5, self-charging is represented by  
terms that include *A*, while diffusion charging is represented by terms with 
$$\beta_{k,j}^{\pm}$$
. If the terms for  
self-charging are removed, eq 5 becomes identical to the charge balance model presented by  
Renard et al. (2013) who predicted electrification phenomena of aerosols in the real atmosphere.  
The mean value of the particle charge distributions can be given by:

160 
$$\frac{dJ_k}{dt} = \frac{d}{dt} \left( \frac{\sum j N_{kj}}{\sum N_{kj}} \right).$$
(6)

161 The mean charge J of the radioactive particles of size k can also be approximated using a simple 162 charge balance equation (Kim et al., 2015):

163 
$$\frac{dJ_k}{dt} = A_k + \beta_{k,J}^+ n_{\rm ion}^+ - \beta_{k,J}^- n_{\rm ion}^-,$$
(7)

164 where  $A_k$  is the radioactivity of the size *k* particles. Similarly to eq 5, the mean charge 165 accumulation rate of the radioactive particles (eq 7) depends on the competition between self-166 and diffusion charging. Eqs 5 and 7 indicate that the net charge of beta-emitting radioactive 167 particles converges to a steady state where self-charging balances diffusion charging. The 168 timescale,  $\tau$ , needed to reach a steady state can be given by (Clement and Harrison, 1992):

169 
$$\tau = \frac{1}{\overline{\beta} n_{\text{ion}}},$$
(8)

170 where  $\overline{\beta^-}$  is the mean attachment coefficient between negative ions and particles. At steady 171 state, the mean charge of the radioactive particles can be approximated using (Clement et al., 172 1995):

173 
$$J_{k} = \begin{cases} y - \left(\frac{y(X-1)}{\exp(2\lambda y) - 1}\right) & \lambda y > 0.22 & (9a) \\ y + \frac{X-1}{2\lambda} & \lambda y \le 0.22 & (9b) \end{cases},$$
(9)

174 with 
$$\lambda = \frac{e^2}{8\pi\varepsilon_0\varepsilon r_k k_B T}$$
,  $y = \frac{\varepsilon_0 A_k}{e\mu_n n_{\text{ion}}^0}$ ,  $n_{\text{ion}}^0 = \sqrt{\frac{q}{\alpha}}$ ,  $X = \frac{\mu_n n_{\text{ion}}^+}{\mu_n n_{\text{ion}}^-}$ 

175 where  $\varepsilon_0$  is the vacuum permittivity,  $\varepsilon$  is the dielectric constant of the air, r is the radius of particles,  $k_B$  is the Boltzmann constant, T is the temperature,  $n_{ion}^0$  is the mean ion concentration, 176 177 and I is the ionization rate coefficient of beta-emitting radionuclides. Eq 9 suggests that the 178 steady-state mean charge of beta-emitting radioactive particles is highly influenced by their size 179 and decay rates, as well as the concentrations and mobilities of ions in air. The second term of 180 the RHS of eq 9(b) represents charge accumulated only by diffusion charging; thus, it can be 181 used to approximate the steady-state mean charge of nonradioactive particles, such as 182 background aerosols that are externally mixed with radionuclides.

# 183 2.3. Population balance models

# 184 2.3.1. Bivariate population balance model

A bivariate population balance model, expressed in terms of particle volume *x* and charge *j*, can be used to predict effects of coagulation on time-dependent changes in the particle size and charge distributions. In the bivariate population balance model, the time-evolution of the number densities of charged and uncharged particles, *n*, due to coagulation, can be given by (Zebel, 1958; Oron and Seinfeld, 1989a&b):

190
$$\frac{\partial n(x,j)}{\partial t} = \frac{1}{2} \sum_{j'=-\infty}^{\infty} \int_{0}^{x} F_{j',j-j'}(x',x-x')n(x',j')n(x-x',j-j')dx' - \sum_{j'=-\infty}^{\infty} \int_{0}^{\infty} F_{j,j'}(x,x')n(x,j)n(x',j')dx'$$
(10)

where F is the coagulation frequency (m<sup>3</sup> s<sup>-1</sup>), which is also called the coagulation (rate) 191 192 coefficient (Jacobson, 2005; Seinfeld and Pandis, 2006), and which can be obtained by 193 multiplying the collision frequency and the collision efficiency. The two terms on the RHS of eq 194 10 represent the production and loss rates of charged and uncharged particles by coagulation, 195 respectively. A numerical solution of eq 10 can be obtained through the discretization of the 196 integral terms, respectively (Oron and Seinfeld, 1989a&b). Vanni (2000) tested several sectional 197 approaches and showed that the approach of Kumar and Ramkrishna (1996) is simpler and more 198 accurate than other tested approaches, and also preserves mass and number of particles. Thus, the 199 sectional approach of Kumar and Ramkrishna (1996) was used in this study to discretize the 200 integral terms of eq 10, leading to the following discretized form:

$$201 \qquad \frac{dN_{kj}}{dt} = \sum_{j'=-\infty}^{\infty} \sum_{\substack{l,m \\ x_{k-1} \le x_l + x_m \le x_{k+1}}}^{\infty} \left(1 - \frac{1}{2}\delta_{l,m}\right) \eta_{l,m} F_{l,m,j-j',j'} N_{l,j-j'} N_{m,j'} - \sum_{j'=-\infty}^{\infty} \sum_{l=1}^{M} F_{k,l,j,j'} N_{k,j} N_{l,j'} , \qquad (11)$$

where indices *l* and *m* refer to the size bins,  $\delta$  is the Kronecker delta,  $\eta_{l,m}$  is a property distribution factor between two size bins given by Kumar and Ramkrishna (1996), and *M* is the total number of the size bins. If coagulation is induced by thermal energy (i.e., Brownian coagulation), the Brownian collision frequency  $\beta^{Br}$  (m<sup>3</sup> s<sup>-1</sup>), which is also called the Brownian collision kernel (Jacobson, 2005), is given by (Fuchs, 1989):

207 
$$\beta_{kl}^{Br} = 4\pi \left( r_k + r_l \right) \left( D_{p,k} + D_{p,l} \right) \left( \frac{r_k + r_l}{r_k + r_l + \sqrt{g_k^2 + g_l^2}} + \frac{4\left( D_{p,k} + D_{p,l} \right)}{(r_k + r_l)\sqrt{v_{p,k}^2 + v_{p,l}^2}} \right)^{-1},$$
(12)

where  $D_p$  is the particle diffusion coefficient, g is the particle mean traveling distance, and  $\overline{v}_p$  is the particle thermal speed in air. Coagulation of charged particles is influenced by electrostatic

- 210 particle-particle interactions. This effect can be accounted for by multiplying the collision
- 211 frequency with the collision efficiency,  $\alpha^{Br}$ , which is also called the coalescence efficiency
- 212 (Fuchs, 1989; Jacobson, 2005; Seinfeld and Pandis, 2006):

213 
$$\alpha_{kl}^{Br} = \frac{u}{e^u - 1}$$
 (13)

214 with 
$$u = \frac{j_k j_l e^2}{4\pi\varepsilon_0 \varepsilon(r_k + r_l)k_B T}$$

In eq 13, *u* indicates the relative importance between electrostatic potential energy and thermalenergy in coagulation.

- 217 2.3.2. Monovariate population balance model
- The time-evolution of the size distribution of particles can be estimated using a monovariate
  population balance model, with only the particle volume as the variable (Kumar and
  Ramkrishna, 1996):

221 
$$\frac{dN_k}{dt} = \sum_{\substack{l,m\\x_{k-1} \le x_l + x_m \le x_{k+1}}}^{l \ge m} \left(1 - \frac{1}{2}\delta_{l,m}^{Kr}\right)\eta_{l,m}F_{l,m}N_lN_m - \sum_{l=1}^M F_{k,l}N_kN_l \ .$$
(14)

The coagulation frequency can be simply corrected using the mean charge of particles. However, the collision efficiency computed with the mean charge can be different from that with the particle charge distributions (Matsoukas, 1997). To include effects of the particle charge distributions on the coagulation frequency, eq (13) can be replaced by the average collision efficiency  $\overline{\alpha}$  (Clement et al., 1995), which involves interaction of all charged particles of size *k* with any charged particles of size *l*.

228 
$$\overline{\alpha}_{kl}^{Br} = 1 + \frac{\sum_{j_k j_l \neq 0} N_{k, j_k} N_{l, j_l} \left( \alpha_{kl}^{Br} - 1 \right)}{\sum_{j_k} N_{k, j_k} \sum_{j_l} N_{l, j_l}}.$$
 (15)

The particle charge distributions needed to calculate  $\bar{\alpha}^{Br}$  can be obtained by assuming a Gaussian distribution:

231 
$$N_{kj} = \frac{\sum_{j} N_{k,j}}{\sqrt{2\pi}\sigma_k} \exp\left(-\frac{(j-J_k)^2}{2\sigma_k^2}\right)$$
 (16)

with

233 
$$\sigma^2 = y + \frac{1}{2\lambda}.$$

# 234 **2.4.** Approaches to couple particle charging with coagulation kinetics

235 Figure 1 shows three approaches which can be used to predict the time-evolution of the charge 236 and size distributions of particles in the atmosphere. All the approaches can be used to simulate 237 charging and coagulation kinetics of atmospheric particles carrying contaminants, including 238 radioactive particles. Approach 1 is a rigorous scheme that simultaneously computes both charge 239 accumulation and coagulation rates of particles using the ion balance model (eqs 1 and 2), the 240 charge balance model (eq 5), and the bivariate population balance model (eq 11). Approach 2 is a 241 simplified scheme of Approach 1, which can be used to predict the particle charge distribution 242 using the mean charge of particles (eq 7) and the Gaussian distribution (eq 16). In order to easily

243	simulate the coagulation of charged particles, Approach 2 employs the monovariate population
244	balance model (eq 14) that corrects the collision frequency using the average collision efficiency
245	(eq 15). Approach 2 can be simplified to Approach 3 by assuming that charge accumulation rates
246	of particles instantaneously reach a steady state, with a timescale based on 5 times larger than $\tau$
247	from eq 8. The steady-state particle charge distribution can be approximated by eqs 9 and 16. In
248	Approach 3, the collision frequency is multiplied by the average collision efficiency to include
249	the influence of electrostatic forces on coagulation. In this work, polarization of particles is not
250	taken into account.

# 252 3. RESULTS AND DISCUSSION

# 253 **3.1. Methods to simulate particle charging**

254 The three approaches attained above employ different methods to simulate charging of particles. 255 These methods were evaluated by comparing their prediction results with measurements obtained using radioactive charge neutralizers (Liu and Pui, 1974; Wiedensohler and Fissan, 256 257 1991; Alonso et al., 1997) and radioactive particles (Gensdarmes et al., 2001). Initial conditions for the simulations were determined from the measurements. The properties of ions observed 258 259 during the measurements are shown in Table 1. For the measurements providing the values of ion mass,  $\beta_{k,j}^{\pm}$  was calculated using Fuchs (1963) and Hoppel and Frick (1986). However, the 260 261 mass of ions was not measured during the experiments performed by Gensdarmes et al. (2001). In these experiments,  $\beta_{k,j}^{\pm}$  was estimated using analytical equations given by Gunn (1954) and 262 263 Harrison and Carslaw (2003).

## 264 3.1.1. Diffusion-Charging Mechanism

265 Figure 2 shows the steady-state charge distributions of nonradioactive particles over a wide size 266 range. Here, the particles were charged by the diffusion charging mechanism. For particles larger 267 than approximately  $0.04 \,\mu\text{m}$  in diameter, the prediction results of all approaches were in good 268 agreement with the measurements [Figures 2 (a) and (b)]. Below  $0.04 - \mu m$  particle size, 269 Approach 1 accurately forecasted the particle charge distributions, but Approaches 2 and 3 270 underestimated the number concentrations of the negatively charged particles [Figure 2 (a)] 271 although the mean charge values of the particles given by all approaches were comparable. 272 Similar discrepancies were observed for the number concentrations of the positively charged 273 particles smaller than about  $0.025 \,\mu\text{m}$  (not shown). 274 Analysis of the discrepancies suggests that they originate from the standard deviation involved in 275 the Gaussian distribution (eq 16). At a given temperature, the width of the particle charge 276 distributions can be significantly influenced by three parameters: the particle size, ion mass, and 277 ion mobility (Wiedensohler and Fissan, 1991). In Approaches 2 and 3, however, the effects of 278 the ion properties are not involved, so particle size primarily drives the standard deviation, which 279 can differ from what Approach 1 gives. When Approaches 2 and 3 used the standard deviation 280 values obtained by Approach 1, their simulation results became closer to the measurements, 281 although the discrepancies are still seen for negatively and positively charged particles smaller 282 than about  $0.02 \,\mu\text{m}$ .

283

In our previous work (Kim et al., 2014; 2015), it has been shown that Approaches 1 and 3 can reliably simulate charging of radioactive particles. Thus, in this study, we focused on evaluating the validity of Approach 2 with the experiments of Gensdarmes et al. (2001) who measured the charge distributions of <sup>137</sup>Cs particles under various ionizing conditions. Ionizing rates of air molecules were estimated using a linear energy transfer equation for energetic electrons emitted by beta decay (Kim et al., 2015). Results of Approach 1 were included as a reference.

292 Figure 3 shows the charge accumulation on radioactive particles under two ionizing conditions:  $q_I = 3.7 \times 10^8 \text{ m}^{-3} \text{ s}^{-1}$  and  $q_I = 7.1 \times 10^6 \text{ m}^{-3} \text{ s}^{-1}$ . Approach 2 predictions are in good agreement with 293 294 observations and Approach 1 values. During the measurements, the self-charging rate of the radioactive particles was constant because of the long half-life of <sup>137</sup>Cs (approximately 30 years), 295 suggesting that changes in their charge accumulation rates may be dominated by diffusion 296 297 charging rates. The ion concentrations in air can rapidly increase at the high ionizing rate considered, suggesting that the diffusion charging rate of the <sup>137</sup>Cs particles quickly increased 298 299 and then became comparable to their self-charging rate (eq 7). The charge accumulation on the 300 radioactive particles promptly reached a steady-state value, and the particle charge distribution 301 was similar to the initial condition (Figure 4). In contrast, the time required to reach the steady-302 state value was much longer at the low ionizing rate considered; hence, the particle charge 303 distribution shifted to the right (see Figure 4), i.e., more positive charge. The agreement observed 304 in Figure 4 between simulation results by Approach 2 and experimental data by Gensdarmes et al. 305 (2001) suggests that Approach 2 can accurately forecast the competition between self- and

diffusion charging on submicron particles carrying radionuclides, and precisely predict theparticle charge distributions.

# 308 *3.1.3. Timescale to Reach Steady-State Charge Accumulation Rate*

309 To evaluate the steady-state assumption of particle charging for atmospheric conditions, the 310 timescale for reaching steady-state (eq 8) is evaluated with Approaches 1 and 2. Figure 5 shows 311 time-dependent changes in the concentrations of negatively charged particles under two different 312 initial conditions of Alonso et al. (1997) who measured the charge distributions of particles of a 313 few nanometers. All particles were initially uncharged or negatively charged. Because the 314 particle size was very small, Approach 1 was used to predict the time-evolution of the particle 315 concentrations. As time elapsed, the initially uncharged particles became negatively charged by 316 capturing negative ions. The diffusion of positive ions led to the discharging of the initially 317 negatively charged particles. For the initial conditions used, the charging and discharging rates of 318 the particles reached a steady state after approximately 0.2 s, respectively. This 319 charging/discharging behavior predicted by Approach 1 is in good agreement with the 320 measurements of Alonso et al.(1997). However, the timescales obtained from eq 8 are shorter 321 than the prediction results, as well as the measurements, because Approach 1 and the 322 observations provided exact timescales, while  $\tau$  in eq 8 is a scaling parameter. Similar results were also obtained for different initial conditions, as well as for the <sup>137</sup>Cs particles (see Table 2). 323 324 Eq 8 is based on the assumptions that (i)  $X \approx 1$ , (ii) all particles are initially uncharged, and (iii) 325 the ion concentrations are constant (Clement and Harrison, 1992). As seen in Figure 6, when all 326 the assumptions were applied, the diffusion charging rate of the radioactive particles became - $8.1 \times 10^{-3}$  s<sup>-1</sup> at the timescale provided by eq 8, which corresponds to approximately 63% of the 327

328	steady-state self-charging rate. If the timescale is increased by a factor of five, the diffusion
329	charging rate reaches about 99 % of the steady-state self-charging rate. Similar results were
330	obtained for other cases with radioactive particles. Thus, eq 8 is valid if the assumptions can be
331	used, and a reliable timescale to reach a steady state (e.g., 99%) can be obtained by multiplying
332	the equation by a factor of 5. However, because the assumptions cannot be used in typical
333	atmospheric conditions, such as $X \neq 1$ (Harrison and Carslaw, 2003), the steady-state assumption
334	of Approach 3 should be evaluated using Approaches 1 or 2.

So far, we have evaluated the validity of the methods used in the three approaches to predict charge accumulation on atmospheric particles. The evaluation results suggest that the method employed in Approach 1 can accurately simulate charging of particles in the free molecule ( $d_p <$ 0.01 µm), transition ( $d_p = 0.01 - 0.2 \mu$ m), and continuum ( $d_p > 0.2 \mu$ m) regimes. The methods used in Approaches 2 and 3 can reliably forecast charging rate of atmospheric particles larger than 0.04 µm.

341

## 342 **3.2.** Validity of the three approaches to couple particle charging with coagulation

- 343 3.2.1. Bivariate Population Balance Model for Approach 1
- 344 Based on the numerical approach of Alonso et al.(1998), Alonso (1999) suggested an analytical
- 345 approach to simultaneously investigate charging and coagulation kinetics of nonradioactive
- 346 particles, smaller than 0.02 μm in diameter. Results of the analytical approach agreed well with
- 347 those of the numerical approach, but the applicability of both analytical approaches may be
- 348 limited as discussed in section Introduction. The analytical approach, however, was found to be

349	useful to validate numerical solutions of population balance equations including diffusion
350	charging and coagulation (Alonso, 1999). In this study, the analytical approach of Alonso (1999)
351	was used to evaluate Approach 1 because Approaches 2 and 3 are not applicable to particles
352	smaller than 0.02 μm, as shown in Figure 2a. In integrating eq 11, an equidistant diameter grid
353	was used for discretization. Particles were assumed to be initially uncharged, monodispersed ( $\frac{d_p}{d_p}$
354	= 0.003 $\mu$ m, $N_t$ = 10 <sup>15</sup> m <sup>-3</sup> ), with a constant ion concentration. The mobility of negative ions was
355	slightly greater than that of positive ions, according to the properties taken from Alonso et al.
356	(1997) (See Table 1). Figure 7 shows the time dependent concentration of particle charge classes.
357	The concentration of uncharged $0.003$ -µm particles decreased with time because of loss due to
358	coagulation and charging by captured ions. However, the loss of particle concentration caused by
359	diffusion charging was negligible because the ion-particle attachment coefficient was small,
360	suggesting that the time-evolution of the charged-particle concentration depends on the
361	uncharged-particle concentration. More negative than positive ions were captured by the
362	uncharged $0.003$ -µm particles and, thus, the concentration of the negatively charged $0.003$ -µm
363	particles is slightly higher than that of the positively charged $0.003$ -µm particles. The
364	concentrations of larger particles (e.g., charged and uncharged $0.006$ -µm particles) increased
365	over time because of the size growth of small particles due to coagulation, as well as the
366	diffusion-charging mechanism. These evolution patterns predicted by Approach 1 were in good
367	agreement with the prediction results given by the analytical approach. As can be seen in Figures
368	2 and 5, the ion balance and charge balance models of Approach 1 accurately predicted the
369	diffusion charging of nanoparticles, suggesting that the numerical solution of the bivariate
370	population balance model (eq 11) reliably predicts coagulation of particles acquiring charge.

#### 372 3.2.2. Average Collision Efficiency of Approaches 2 and 3

considered for the validation test of Approach 1.

373 Approaches 2 and 3 employ an average collision efficiency and are coupled to the monovariate, 374 instead of the bivariate, population balance model. These approaches provided accurate particle 375 charge distributions for various cases (e.g., Figures 2 and 4; Kim et al., 2014), suggesting that 376 their validity may be highly influenced by the accuracy of the average collision efficiency. Thus, 377 we compared simulation results of Approach 2 with those of Approach 1 to check if the average 378 collision efficiency (eq 15) can appropriately account for the influence of the charge distributions 379 of particles on their size growth via coagulation. For comparison, simulation results of Approach 380 2 using the mean charge (eq 13), as well as those for uncharged particles, were included. 381 Similarly to Oron and Seinfeld (1989 a&b), we assumed monodispersed initial size distributions  $(d_p = 0.1 \ \mu\text{m}, 0.5 \ \mu\text{m}, 1 \ \mu\text{m}, \frac{N_t = 10^{13} \ \text{m}^{-3}}{\text{m}^{-3}}, \text{ and } n_{\text{ion}}^0 = 10^{16} \ \text{m}^{-3}})$ . The geometrical grids  $(x_{k+1} = 2x_k)$ 382 383 were used to cover a wide particle-size range. Other basic assumptions were similar to those 384

385 Figure 8 shows the time-evolution of the particle size distributions induced by particle charging 386 and coagulation. The simulation conditions led to the accumulation of more negative than 387 positive charges on the particles. At t = 1 min, the number fraction of the negatively charged 388 particles was 0.7, while that of the positively charged and uncharged particles was 0.16 and 0.14, 389 respectively. Thus, the size growth of the particles by coagulation was suppressed due to the 390 generation of strong repulsive electrostatic forces (Approaches 1 and 2 vs Uncharged).

391 While most particles were negatively charged, some particles captured positive ions. Owing to

electrostatic attractive forces, the positively charged particles can more frequently coagulate with 392

393 the negatively charged particles and grow. Therefore, the coagulation rates predicted by 394 Approach 2 with the average collision efficiency were slightly higher than those for the case 395 assuming that all particles were negatively charged [Approach 2 (eq 13) vs Approach 2 (eq 15)]. 396 These coagulation patterns predicted by Approach 2 using the average collision efficiency were 397 in good agreement with those given by Approach 1 [Approach 1 vs Approach 2 (eq 15)], as well 398 as the particle charge distributions in various size ranges (Figure S1). Similar results were obtained for different initial particle size distributions ( $d_p = 0.1 \ \mu m$ ;  $d_p = 1 \ \mu m$ ). Thus, the 399 400 monovariate population balance model using the average collision efficiency can be used to 401 simultaneously investigate charging and coagulation kinetics of atmospheric particles. These 402 validation tests suggest that all the approaches developed can be used to reliably couple particle 403 charging with coagulation kinetics of atmospheric particles.

404

#### 405 **3.3. Applications**

# 406 *3.3.1. Radioactive Neutralizer*

Radioactive neutralizers are typically used to control the charge of atmospheric particles in many
laboratory-scale experiments. The applicability of the three approaches to studies using
radioactive neutralizers was evaluated using the experiments of Alonso et al. (1998) who
measured the size distribution of nanometer-size particles passing by a <sup>241</sup>Am radioactive
neutralizer under various residence times.

Figure 9 shows the size distribution of negatively charged particles when the residence time, t = 0.318 s. All particles were initially uncharged, but some particles became charged by capturing

414 positive and negative ions in the neutralizer. Approach 1 accurately predicted the size
415 distribution of the negatively charged particles, while the predictions by Approaches 2 and 3
416 were different from the measurements. The particle size distributions predicted by all the
417 approaches were similar (not shown). It can be concluded that the Gaussian distribution used in
418 Approaches 2 and 3 cannot accurately predict the charge distributions of very small particles
419 (See Figure 2). Thus, Approaches 2 and 3 should not be used for particles smaller than 0.04 µm.

As shown in Figures 2-5, Approach 1 can accurately predict the charge accumulation rate of
radioactive and nonradioactive particles in the free-molecule, transition, and continuum regimes.
Approach 1 employs the interpolation formula of Fuchs that can be used to compute the collision
frequency of the particles in these regimes, revealing that this approach can also precisely predict
the charge distribution of larger particles undergoing coagulation. These results suggest that
Approach 1 can be a reasonable option to simultaneously simulate charging and coagulation of
particles of any size in laboratory-scale experiments.

# 427 *3.3.2.* Charging and Coagulation of Nonradioactive Particles in Urban Atmosphere

Hoppel (1985) simulated charging of 0.06-µm urban aerosols by diffusion charging; however,
effects of coagulation on their steady-state charge distribution were excluded from the simulation.
Changes in the particle charge and size distributions by charging and coagulation were
investigated in this work on the basis of the simulation of Hoppel (1985) for comparison. The
simulation time was approximately 100 min, but for completeness, we repeated and extended the
Hoppel (1985) simulation to 1 day. The extended results were compared with prediction results
of Approach 1, which involves the effects of coagulation on the particle charge distribution. It

435 was assumed that cosmic rays and natural radioactivity generate ion pairs in the atmosphere, 436 giving  $q_b \approx 10^7 \text{ m}^{-3} \text{ s}^{-1}$  (Hoppel, 1985).

Figure 10 presents changes in the particle charge and size distributions vs time. The simulation results performed by Hoppel (1985) showed that the particle charge distribution approached its steady-state value after approximately 90 min. However, as time elapsed, the particles grew in size due to coagulation. The size growth led to the generation of large particles capturing many ions, thereby modifying the particle charge distribution.

442 The simulation results of Hoppel (1985) also indicated that the ion concentrations became 443 unchanged after reaching a steady state. However, coagulation reduced the particle number 444 concentrations which can affect the loss rate of ions by diffusion charging (see eqs 1 and 2). The 445 reduction in the particle concentrations increased the ion concentrations, thereby enhancing the electrical conductivity of the postulated atmosphere (Figure 11). The ion concentrations and 446 electrical conductivity are expected to increase until ion-ion recombination becomes the major 447 448 ion removal mechanism. These results suggest that coagulation can affect the electrical 449 properties in the atmosphere, as well as the particle charge distribution.

450 3.3.3. Charging and Coagulation of Radioactive Particles in the Atmosphere

451 3.3.3.1. Comparison with results by Greenfield (1956)

452 Nuclear events can release particles carrying radionuclides. Greenfield (1956) simulated time-

453 evolution of the charge distribution of 0.1 µm radioactive particles emitting energetic electrons at

454 6-km altitude. Because Greenfield (1956) assumed that the particle size distribution is constant

455 for 4 hours, the influence of coagulation on the particle charge distribution was evaluated using456 the simulation conditions postulated by Greenfield (1956).

457 Figure 12 shows changes in the particle charge distributions vs time. Both self-charging and 458 diffusion charging influenced the charge accumulation on radioactive particles. Due to many ion 459 pairs produced by beta radiation (Figure S2), positive charge accumulated on the particles by 460 self-charging was rapidly neutralized by capturing negative ions. Thus, the particle charge 461 distribution given by Approach 1 was slightly shifted to the right of the zero elementary charge 462 in Figure 12(a), although large particles with a high level of radioactivity were generated by 463 coagulation. As time elapsed, the particle charge distribution was slightly moved to the left. 464 Because the decay rates of the highly radioactive particles were reduced over time, their self-465 charging rates also decreased, and this led to the slight movement of the charge distribution to 466 the left in Figure 12(a).

The discrepancies between the predictions of Approach 1 and Greenfield (1956) result mainly
from the ion-particle attachment coefficient used in the simulation. The values assumed by
Greenfield (1956) were beyond the ion-particle attachment coefficient found by other researchers
(e.g., Hoppel and Frick, 1986), leading to the discrepancies observed (Kim et al., 2015).

471 Beta radiation caused by radioactive decay rapidly increased the ion concentrations, thereby 472 enhancing the electrical conductivity in the atmosphere (Figure S2). In contrast to the case 473 shown in Figure 11, the ion concentrations and air conductivity significantly decreased with time 474 because the ionization rate of air molecules decreased considerably, and ion-ion recombination 475 was responsible for the change in the concentrations. Nevertheless, the air conductivity

476 enhancement by beta radiation was much higher than that by cosmic rays and natural477 radioactivity.

478 After the Chernobyl and Fukushima accidents, short- and long-range transport of particles carrying radionuclides, such as <sup>137</sup>Cs and <sup>134</sup>Cs, affected the electrical properties of the local 479 480 atmosphere in many places (Israelsson and Knudsen, 1986; Yamauchi et al., 2012). In particular, 481 beta radiation led to significant changes in the electrical conductivity and potential gradient in 482 the local atmosphere (Kim et al., 2015). Israelsson et al. (1987) suggested that an increase in the 483 electrical conductivity led to enhancement of lightning activities at radioactively contaminated 484 sites in Sweden. These observations reveal that the approaches developed in this study can be 485 employed to investigate the influence of radionuclides on electrification phenomena in the 486 atmosphere.

487 3.3.3.2. Steady-state assumption of radioactive particle charging

488 The steady-state assumption of particle charging can be useful to simulate coagulation of 489 radioactive particles in model studies of radioactivity transport. Charging and coagulation 490 kinetics of radioactive particles were investigated using Approaches 2 and 3 to evaluate the 491 validity of the steady-state assumption of radioactive particle charging. For comparison, the size 492 growth of particles by coagulation was simulated by assuming the Boltzmann charge distribution. 493 We used the simulation condition employed to validate the average collision efficiency, but additionally presumed that radioactive decay of <sup>134</sup>Cs is responsible for the ionization of air 494 molecules. The specific radioactivity of <sup>134</sup>Cs was obtained from Clement and Harrison (1992). 495

496 The ionization rate of  $^{134}$ Cs was estimated according to Kim et al. (2015). Under these conditions,

497 eq 8 revealed that  $5\tau \approx 4.3$  ms. Thus, we assumed that charge accumulation rates of <sup>134</sup>Cs 498 particles instantaneously reach steady state, and evaluated this assumption for the simulation 499 conditions of  $X \approx 0.7$  and ion concentration given by  $q_I = I_{Cs=134} \times A_{Cs=134} \times N_t$ .

500 Figure 13 shows the charge and size distributions of the  $^{134}$ Cs particles after 2 hours of evolution.

501 The prediction results of Approach 3 were different from those of the case assuming the

502 Boltzmann charge distribution, but agreed well with those of Approach 2, suggesting that the

503 steady-state assumption of radioactive particle charging can be valid if  $\tau$  is small. We also tested

the assumption of Approach 3 using different initial conditions (e.g.,  $d_p = 0.3 \ \mu m$ ), and the

505 agreement was still maintained (not shown).

506

# 507 **3.4. Computational costs**

508 The computational costs to predict transport of particles containing contaminants depends on the

509 number of ordinary differential equations (ODEs) solved during simulation. Thus, the number of

510 ODEs involved in the three approaches was evaluated by assuming 30 size bins, which

511 corresponds to those used in the two-moment aerosol sectional microphysics model, covering

512 particle diameters from 0.01  $\mu$ m to 10  $\mu$ m (Adams and Seinfeld, 2002).

513 Table 3 shows an example of the computational costs of the three approaches. For Approach 1,

514 we assumed that atmospheric particles can acquire up to fifteen elementary charges regardless of

- their sign, thereby resulting in 932 ODEs. Because Approaches 2 and 3 employed the
- 516 monovariate population balance model, a fewer number of ODEs were involved in these
- 517 Approaches than in Approach 1, suggesting that they are computationally more efficient. For

instance, compared to Approach 1, Approaches 2 and 3 more quickly computed the chargeaccumulation and coagulation rates of urban aerosols.

520 A simple way to reduce the number of ODEs included in Approach 1 is to assume that 521 atmospheric particles acquire only a few electrical charges. For example, Laakso et al. (2002) 522 assumed that submicron particles can acquire elementary charges from -5 to +5. This assumption 523 can be valid if the particle size is small [see Figure 2 (a)]. However, when the simulation 524 conditions were used, we observed loss of submicron particles because they can acquire more 525 elementary charges (Figure S3). To preserve mass and charge, one may optimize the minimum 526 number of elementary charges using the charge balance model of Approach 1, and then begin the 527 simulation of charging of particles undergoing coagulation.

528 Approach 3 includes all the physics of charging and coagulation to predict the particle

529 size/charge distribution, but, compared to Approaches 1 and 2, it is computationally more

530 suitable for use in a 3-D global transport model to predict the transport of radioactivity in the

531 environment after a radiological event such as a nuclear plant accident.

532

## 533 4. CONCLUSIONS

534 Understanding the behavior of atmospheric particles is important to accurately predict short- and 535 long-range transport of contaminants. Particle charging and coagulation processes can strongly 536 affect the behavior of atmospheric particles because these processes can change their important 537 physical and electrical properties, such as size and charge. This study has shown three 538 approaches with a wide range of complexity and applications to involve the mutual effects of

539	charging and coagulation processes in the simulation of particle charge and size distributions vs
540	time. Depending on the initial conditions, these approaches can be employed to accurately
541	predict the behavior of atmospheric particles carrying radioactive contaminants. We have shown
542	the approaches to be applicable to a wide variety of atmospheric (laboratory and field)
543	applications. The accuracy of the approaches depends on the assumptions made to reduce
544	computational cost. The developed approaches can be readily incorporated into microphysical
545	and transport models of any scale to account for charging phenomena of atmospheric particles.
546	
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#### Negative ions Positive ions References Mass Mobility Mass Mobility $(\text{cm}^2 \text{ V}^{-1} \text{ s}^{-1})$ $(\text{cm}^2 \text{ V}^{-1} \text{ s}^{-1})$ (AMU) (AMU) Alonso et al. (1997) 150 80 1.15 1.65 Liu and Pui (1974)<sup>a</sup> 140 1.4 1.6 101 Wiedensohler and Fissan (1991) 140 101 1.4 1.6 Gensdarmes et al. (2001) \_ 1.19 1.54

# Table 1. Properties of ions used for experimental observations

<sup>a</sup> The properties of ions were obtained from Wiedensohler and Fissan (1991), who used a radioactive neutralizer similar to that employed by Liu and Pui (1974).

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Table 2. Timescales required for particles to reach steady-state charge

Charging mechanism	Particle diameter (µm)	Steady-state mean ion concentration (m <sup>-3</sup> )	τ (s) (eq 8)	Numerical timescale (s) (Approach 1 or 2)	Timescale from measurments (s)	Reference
	<mark>0.0071</mark>	$8.0\times10^{12}$	0.04	0.2 ~ 0.4	0.3	
Diffusion	<mark>0.0070</mark>	$2.0\times10^{13}$	0.02	0.2 ~ 0.4	0.3	Alonso et al. (1997)
charging	<mark>0.0027</mark>	$8.0\times10^{12}$	0.04	0.2 ~ 0.4	0.3	
	<mark>0.0026</mark>	$2.0\times10^{13}$	0.02	0.2 ~ 0.4	0.3	
	0.82	$2.1  imes 10^9$	171.1	> 1,000	-	
Diffusion charging	0.82	$1.5  imes 10^{10}$	23.6	> 200	-	Gensdarmes et al.(2001)
and self-charging	1.05	$7.6  imes 10^8$	471.6	> 3,000	-	
	1.05	$7.0  imes 10^9$	51	> 500	-	

#### Example: 30 size bins Approach 2 Approach 3 Approach 1 2 2 Ion balance model \_ Charge balance model 30 The number $30 \times 31 = 930$ of ODEs Population balance model 30 30 Total 932 62 30 Computational time for urban $aerosol^{a,b}(s)$ 12724.2 302.6 8.5

# Table 3. Computational costs of the approaches used

<sup>a</sup> Simulation conditions:  $d_g = 0.116 \,\mu\text{m}$ ,  $\sigma_g = 1.46$ ,  $N_t = 6.718 \times 10^9 \,\text{m}^{-3}$  and  $q = 10^7 \,\text{m}^{-3} \,\text{s}^{-1}$  (Kim et al., 2015). The simulation time is 6 hours.

<sup>b</sup> Computational resources: Intel(R) Core(TM)2 Duo CPU E6850 @ 3.00 GHz with 4GB RAM and Matlab ODE solver.

#### 676 Figure captions

Figure 1. Three approaches to predict time-dependent changes in the particle size and charge

678 distributions in the atmosphere.

- Figure 2. Steady-state charge distributions of particles capturing positive and negative ions. Thesymbols represent the measurements of the charge distributions of particles.
- Figure 3. Charge accumulation on <sup>137</sup>Cs particles under two ionizing conditions:  $q_I = 7.1 \times 10^6 \text{ m}^{-3}$
- 682 s<sup>-1</sup> and  $q_I = 3.7 \times 10^8 \text{ m}^{-3} \text{ s}^{-1}$  ( $d_p = 0.82 \text{ } \mu\text{m}$ ;  $A_{Cs-137} = 12.8 \text{ } \text{mBq}$ ). The symbols represent the mean
- value of the particle charge distributions measured by Gensdarmes et al.(2001).
- Figure 4. Charge distributions of <sup>137</sup>Cs particles under two ionizing conditions:  $q_I = 7.1 \times 10^6 \text{ m}^{-3}$

685 s<sup>-1</sup> and  $q_1 = 3.7 \times 10^8 \text{ m}^{-3} \text{ s}^{-1}$  ( $d_p = 0.82 \text{ } \mu\text{m}$ ;  $A_{Cs-137} = 12.8 \text{ } \text{mBq}$ ). The prediction results of

- 686 Approach 2 were compared with the measurements of Gensdarmes et al.(2001).
- Figure 5. Timescale to reach steady-state charge accumulation rates of  $0.0071 \,\mu\text{m}$  nanoparticles.
- The lines are the simulation results of Approach 1. The symbols are the measurements of Alonso
- 689 et al.(1997). Charging timescales were estimated using eq 8 ( $\tau_{charging} = 0.042$  s and  $\tau_{discharging} =$
- 690 0.017 s), as well as Approach 1 and the measurements.
- Figure 6. Charge accumulation rate of <sup>137</sup>Cs particles for each charging mechanism ( $d_p = 0.82$
- 692  $\mu$ m;  $A_{Cs-137} = 12.8 \text{ mBq}$ ;  $q_1 = 7.1 \times 10^6 \text{ m}^{-3} \text{ s}^{-1}$ ). The assumptions used in eq 8 were applied to
- 693 evaluate the validity of the equation.  $A_{Cs-137}$  corresponds to the self-charging rate of the
- 694 radioactive particles.
- Figure 7. Validation of the numerical solution for the bivariate population balance model under a
- 696 monodispersed initial condition ( $d_p = 0.003 \ \mu m$ ,  $N_t = 10^{15} \ m^{-3}$ , and  $n_{ion}^0 = 10^{18} \ m^{-3}$ ). The lines
- and symbols represent the results of the analytical solution of Alonso (1999) and eq 11,
- 698 respectively.

699 Figure 8. Time-evolution of the particle size distributions predicted by the monovariate

700 population balance model with the average collision efficiency (eq 15) under a monodispersed

initial condition ( $d_p = 0.5 \,\mu\text{m}$ ,  $N_t = 10^{13} \,\text{m}^{-3}$ ;  $n_{ion}^0 = 10^{16} \,\text{m}^{-3}$ ). Approach 1 was used as a reference that includes the mutual effect of surface charging and coagulation on the particle size and charge distributions.

Figure 9. Evolution of the size distribution of negatively charged particles in a <sup>241</sup>Am radioactive neutralizer. For the initial condition,  $d_g = 0.0055 \ \mu m$ ,  $\sigma_g = 1.23$ , and  $N_t = 5 \times 10^{15} \ m^{-3}$ . The lines represent the simulation result of Approach 1. The symbols are the measurements of Alonso et al.(1998).

708 Figure 10. Time-evolution of the charge (a) and size (b) distributions of atmospheric particles in

709 the postulated atmosphere of Hoppel (1985) ( $d_p = 0.06 \ \mu m$ ,  $N_t = 2.3 \times 10^{10} \ m^{-3}$ ;  $q = 10^7 \ m^{-3} \ s^{-1}$ ).

Approach 1 was used to involve the effects of coagulation on the Hoppel (1985) simulation.

711 Figure 11. Time-evolution of the mean ion concentration,  $n_0$  and air conductivity,  $\sigma_{air}$  in the

- 712 postulated atmosphere of Hoppel (1985) ( $d_p = 0.06 \ \mu m$ ,  $N_t = 2.3 \times 10^{10} \ m^{-3}$ ;  $q = 10^7 \ m^{-3} \ s^{-1}$ ).
- 713 Figure 12. Time-evolution of the charge (a) and size (b) distributions of monodispersed

714 radioactive particles at 6 km altitude ( $d_p = 0.1 \,\mu\text{m}$ ,  $N_t = 3.55 \times 10^{10} \,\text{m}^{-3}$ ;  $I = 1.5 \times 10^4 \,\text{s}^{-1}$ ). Approach

1 was used to simultaneously simulate surface charging and coagulation of radioactive particles.

- 716 Figure 13. The charge (a) and size (b) distributions of initially monodispersed <sup>134</sup>Cs particles ( $d_p$
- 717 = 0.5  $\mu$ m,  $A_{Cs-134}$  = 14.5 Bq;  $N_t$  = 10<sup>13</sup> m<sup>-3</sup>). The simulation time is 2 hours.
- 718



Figure 1. Three approaches to predict time-dependent changes in the particle size and charge

721 distributions in the atmosphere.



Figure 2. Steady-state charge distributions of particles capturing positive and negative ions. The

symbols represent the measurements of the charge distributions of particles.



726

Figure 3. Charge accumulation on <sup>137</sup>Cs particles under two ionizing conditions:  $q_I = 7.1 \times 10^6 \text{ m}^{-3}$ s<sup>-1</sup> and  $q_I = 3.7 \times 10^8 \text{ m}^{-3} \text{ s}^{-1}$  ( $d_p = 0.82 \text{ }\mu\text{m}$ ;  $A_{Cs-137} = 12.8 \text{ }\text{mBq}$ ). The symbols represent the mean value of the particle charge distributions measured by Gensdarmes et al.(2001).



Figure 4. Charge distributions of <sup>137</sup>Cs particles under two ionizing conditions:  $q_I = 7.1 \times 10^6 \text{ m}^{-3}$ s<sup>-1</sup> and  $q_I = 3.7 \times 10^8 \text{ m}^{-3} \text{ s}^{-1}$  ( $d_p = 0.82 \text{ } \mu \text{m}$ ;  $A_{Cs-137} = 12.8 \text{ } \text{mBq}$ ). The prediction results of

Approach 2 were compared with the measurements of Gensdarmes et al.(2001).



734

735 Figure 5. Timescale to reach steady-state charge accumulation rates of 0.0071 μm nanoparticles.

The lines are the simulation results of Approach 1. The symbols are the measurements of Alonso

et al.(1997). Charging timescales were estimated using eq 8 ( $\tau_{charging} = 0.042$  s and  $\tau_{discharging} =$ 

738 0.017 s), as well as Approach 1 and the measurements.



Figure 6. Charge accumulation rate of <sup>137</sup>Cs particles for each charging mechanism ( $d_p = 0.82$   $\mu$ m;  $A_{Cs-137} = 12.8 \text{ mBq}$ ;  $q_1 = 7.1 \times 10^6 \text{ m}^{-3} \text{ s}^{-1}$ ). The assumptions used in eq 8 were applied to evaluate the validity of the equation.  $A_{Cs-137}$  corresponds to the self-charging rate of the radioactive particles.



Figure 7. Validation of the numerical solution for the bivariate population balance model under a

747 monodispersed initial condition ( $d_p = 0.003 \ \mu m$ ,  $N_t = 10^{15} \ m^{-3}$ , and  $n_{ion}^0 = 10^{18} \ m^{-3}$ ). The lines

and symbols represent the results of the analytical solution of Alonso (1999) and eq 11,

respectively.



Figure 8. Time-evolution of the particle size distributions predicted by the monovariate population balance model with the average collision efficiency (eq 15) under a monodispersed initial condition ( $d_p = 0.5 \mu m$ ,  $N_t = 10^{13} m^{-3}$ ;  $n_{ion}^0 = 10^{16} m^{-3}$ ). Approach 1 was used as a reference that includes the mutual effect of surface charging and coagulation on the particle size and charge distributions.





Figure 9. Evolution of the size distribution of negatively charged particles in a <sup>241</sup>Am radioactive neutralizer. For the initial condition,  $d_g = 0.0055 \,\mu\text{m}$ ,  $\sigma_g = 1.23$ , and  $N_t = 5 \times 10^{15} \,\text{m}^{-3}$ . The simulation time is 0.318s. The measurements were taken from Alonso et al.(1998).









Figure 10. Time-evolution of the charge (a) and size (b) distributions of atmospheric particles in the postulated atmosphere of Hoppel (1985) ( $d_p = 0.06 \,\mu\text{m}$ ,  $N_t = 2.3 \times 10^{10} \,\text{m}^{-3}$ ;  $q = 10^7 \,\text{m}^{-3} \,\text{s}^{-1}$ ).

Approach 1 was used to involve the effects of coagulation on the Hoppel (1985) simulation.



770 postulated atmosphere of Hoppel (1985) ( $d_p = 0.06 \ \mu m$ ,  $N_t = 2.3 \times 10^{10} \ m^{-3}$ ;  $q = 10^7 \ m^{-3} \ s^{-1}$ ).



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Figure 12. Time-evolution of the charge (a) and size (b) distributions of monodispersed radioactive particles at 6 km altitude ( $d_p = 0.1 \mu m$ ,  $N_t = 3.55 \times 10^{10} m^{-3}$ ;  $I = 1.5 \times 10^4 s^{-1}$ ). Approach 1 was used to simultaneously simulate surface charging and coagulation of radioactive particles.



Figure 13. The charge (a) and size (b) distributions of initially monodispersed <sup>134</sup>Cs particles ( $d_p$ = 0.5 µm,  $A_{Cs-134}$  = 14.5 Bq;  $N_t$  = 10<sup>13</sup> m<sup>-3</sup>). The simulation time is 2 hours.