



## **A Novel Framework for Molecular Characterization of Atmospheric Organic Aerosol Based on Collision Cross Section and Mass-to-Charge Ratio**

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## 1 Abstract

2 A new metric is introduced for representing the molecular signature of atmospheric  
3 organic aerosols, the collision cross section ( $\Omega$ ), a quantity that is related to the structure  
4 and geometry of molecules and is derived from ion mobility measurements. By  
5 combination with the mass-to-charge ratio ( $m/z$ ), a two-dimensional  $\Omega - m/z$  space is  
6 developed to facilitate the comprehensive investigation of the complex organic aerosol  
7 mixture. A unique distribution pattern of chemical classes, characterized by functional  
8 groups including amine, alcohol, carbonyl, carboxylic acid, ester, and organic sulfate, is  
9 developed on the 2-D  $\Omega - m/z$  space. Species of the same chemical class, despite  
10 variations in the molecular structures, tend to situate as a narrow band on the space and  
11 follow a trend line. Reactions involving changes in functionalization and fragmentation  
12 can be represented by the directionalities along or across these trend lines, thus allowing  
13 for the interpretation of mechanisms associated with the formation and evolution of  
14 atmospheric organic aerosol. The characteristics of trend lines for a variety of  
15 functionalities that are commonly present in ambient aerosols can be predicted by the  
16 core model simulations, which provide a useful tool to identify the chemical class to  
17 which an unknown species belongs on the  $\Omega - m/z$  space. Within the band produced by  
18 each chemical class on the space, molecular structural assignment can be achieved by  
19 utilizing collision induced dissociation as well as by comparing the measured collision  
20 cross sections in the context of those obtained via molecular dynamics simulations.

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## 28 1. Introduction

29 Organic aerosol (OA) constitutes a major fraction of sub-micrometer atmospheric  
30 particulate matter and comprises a complex and dynamic system linking source emission,  
31 chemical transformation, and phase partitioning (Hallquist et al., 2009). It consists of a  
32 multitude of organic species that arise from primary emissions and secondary  
33 productions. Once in the atmosphere, OA species actively evolve via gas-particle  
34 conversion and multiphase chemistry. The complexity and dynamic behaviors of ambient  
35 OA have rendered identification of major pathways contributing to OA budget difficult  
36 and have limited our capability to evaluate its impact on human health and global  
37 climate.

38 Several two-dimensional frameworks have been developed in an effort to deconvolve  
39 the complexity of OA mixtures and visualize their atmospheric transformations. The Van  
40 Krevelen diagram, which scatter plots the hydrogen-to-carbon atomic ratio (H:C) and the  
41 oxygen-to-carbon atomic ratio (O:C), has been widely used to represent the bulk  
42 elemental composition and the degree of oxygenation of organic aerosol (Heald et al.,  
43 2010). The average carbon oxidation state ( $\overline{OS}_C$ ), a quantity that necessarily increases  
44 upon oxidation, can be estimated from the elemental ratios (Kroll et al., 2011). When  
45 coupled with carbon number ( $n_C$ ), it provides constraints on the chemical composition of  
46 organic aerosol and defines key classes of atmospheric processes based on the unique  
47 trajectory of the evolving OA composition on the  $\overline{OS}_C - n_C$  space. The degree of  
48 oxidation has also been combined with the volatility (expressed as the effective saturation  
49 concentration,  $C^*$ ), forming a 2-D volatility basis set to describe the coupled aging and  
50 phase partitioning of organic aerosol (Donahue et al., 2012). These three spaces are  
51 designed to represent fundamental properties of the OA mixture and provide insight into  
52 the OA chemical evolution in the atmosphere. Organic aerosol components span large  
53 varieties in the physicochemical properties. Species of similar volatility or elemental  
54 composition can differ vastly in structures and functionalities. One weakness of these  
55 frameworks is that they do not provide information on the OA components at molecular  
56 level.



57 In this article we introduce a new framework that is based on the collision cross  
58 section ( $\Omega$ ), a quantity that is related to the structure and geometry of a molecule. The  
59 collision cross section of a charged molecule determines its mobility as it travels through  
60 a neutral buffer gas such as  $N_2$  under the influence of a weak and uniform electric field.  
61 Species with open conformation undergo more collisions with buffer gas molecules and  
62 hence travel more slowly than the compact ones (Shvartsburg et al., 2000; Eiceman et al.,  
63 2013). Mobility measurements are usually performed with an Ion Mobility Spectrometer  
64 (IMS), where ions are separated mainly on the basis of their size, geometry, as well as  
65 interactions with the buffer gas. The combination of IMS with a Mass Spectrometer (MS)  
66 allows for further selection of ions based on their mass-to-charge ratios. The resulting  
67 IMS-MS plot provides separation of molecules according to two different properties:  
68 geometry (as reflected by the collision cross section) and mass (as reflected by the mass-  
69 to-charge ratio) (Kanu et al., 2008). The Ion Mobility Spectrometry - Mass Spectrometry  
70 (IMS-MS) analytical technique has been widely employed in the fields of biochemistry  
71 (McLean et al., 2005; Liu et al., 2007; Dwivedi et al., 2008; Roscioli et al., 2013; Groessl  
72 et al., 2015) and homeland security (Eiceman and Stone, 2004; Ewing et al., 2001;  
73 Fernandez-Maestre et al., 2010). To our knowledge, the application of IMS-MS to study  
74 organic species in the atmosphere, however, has only been explored very recently  
75 (Krechmer et al., 2016).

76 We propose a two-dimensional collision cross section vs. mass-to-charge ratio ( $\Omega -$   
77  $m/z$ ) space to facilitate the comprehensive investigation of complex OA mixtures. Despite  
78 the typical complexity of the detailed molecular mechanism of OA production and  
79 evolution, oxidized molecules that constitute OA can be characterized by their distinctive  
80 functional groups (Zhang and Seinfeld, 2013). We show that the investigated organic  
81 classes ( $m/z < 600$ ), characterized by functional groups including amine, alcohol,  
82 carbonyl, carboxylic acid, ester, and organic sulfate, exhibit unique distribution patterns  
83 on the  $\Omega - m/z$  space. Species of the same chemical class, despite variations in the  
84 molecular structures, tend to develop a narrow band and follow a trend line on the space.  
85 Reactions involving changes in functionalization and fragmentation can be represented  
86 by directionalities along or across these trend lines. The locations and slopes of the  
87 measured trend lines are shown to be predicted by the core model (Mason et al., 1972),



88 which characterizes the ion-neutral interactions as elastic sphere collisions. Within the  
89 narrow band produced by each chemical class on the  $\Omega - m/z$  space, molecular structural  
90 assignment is achieved with the assistance of collision induced dissociation analysis.  
91 Measured collision cross sections are also shown to be consistent with theoretically  
92 predicted values from the trajectory method (Mesleh et al., 1996; Shvartsburg and  
93 Jarrold, 1996) and are used to identify isomers that are separated from an isomeric  
94 mixture.

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## 96 2. Collision Cross Section Measurements

### 97 2.1 Materials

98 A collection of chemical standards (ACS grade,  $\geq 96\%$ , purchased from Sigma  
99 Aldrich, St. Louis, MO, USA), classified as amines, alcohols, carbonyls, carboxylic  
100 acids, esters, phenols, and organic sulfates, were used to characterize the performance of  
101 IMS-MS. These chemicals were dissolved in an HPLC-grade solvent consisting of a 70%  
102 methanol / 29% water with 1% formic acid, at a concentration of approximately 10  $\mu\text{M}$ .

### 103 2.2 Instrumentation

104 Ion mobility measurements were performed using an Electrospray Ionization (ESI)  
105 Drift-Tube Ion Mobility Spectrometer (DT-IMS) interfaced to a Time-of-Flight Mass  
106 Spectrometer (TOFMS). The instrument was designed and manufactured by TOFWERK  
107 (Switzerland), with detailed descriptions and schematics provided by several recent  
108 studies (Kaplan et al., 2010; Zhang et al., 2014; Groessl et al., 2015; Krechmer et al.,  
109 2016). In the next few paragraphs, we will present the operating conditions of the ESI-  
110 IMS-TOFMS instrument.

111 Solutions of chemical standards were delivered to the ESI source via a 250  $\mu\text{L}$  gas-  
112 tight syringe (Hamilton, Reno, NV, USA) held on a syringe pump (Harvard Apparatus,  
113 Holliston, MA, USA) at a flow rate of 1  $\mu\text{L min}^{-1}$ . A deactivated fused silica capillary  
114 (360  $\mu\text{m}$  OD, 50  $\mu\text{m}$  ID, 50 cm length, New Objective, Woburn, MA, USA) was used as  
115 the sample transfer line. The ESI source was equipped with an uncoated SilicaTip Emitter  
116 (360  $\mu\text{m}$  OD, 50  $\mu\text{m}$  ID, 30  $\mu\text{m}$  tip ID, New Objective, Woburn, MA, USA) and



117 connected to the capillary through a conductive micro union (IDEX Health & Science,  
118 Oak Harbor, WA, USA). The ESI emitter was operated at both positive and negative  
119 mode at a capillary voltage of  $\pm (1.5 - 2.0)$  kV. The charged droplets generated at the  
120 emitter tip migrate through a desolvation region in nitrogen atmosphere at room  
121 temperature, where ions evaporate from the droplets and are introduced into the drift tube  
122 through a Bradbury-Nielsen ion gate located at the entrance. The ion gate was operated in  
123 the Hadamard Transform mode, with a closure voltage of  $\pm 50$  V and an average gate  
124 pulse frequency of  $1.2 \times 10^3$  Hz. The drift tube was held at a constant temperature ( $340 \pm 3$   
125 K) and atmospheric pressure ( $\sim 1019$  mbar). A counter flow of  $N_2$  drift gas was  
126 introduced at the end of the drift region at a flow rate of  $1.2$  L  $min^{-1}$ . Ion mobility  
127 separation was carried out at a typical field strength of  $300 - 400$  V  $cm^{-1}$ , resulting in a  
128 reduced electric field of approximately  $1.4 - 1.8$  Td. After exiting from the drift tube,  
129 ions were focused into TOFMS through a pressure-vacuum interface that includes two  
130 segmented quadrupoles that were operated at  $\sim 2$  mbar and  $\sim 5 \times 10^{-3}$  mbar, respectively.  
131 Collision Induced Dissociation (CID) of parent ions is achieved by adjusting the voltages  
132 on the ion optical elements between the two quadruple stages (Kaplan et al., 2010).

133 The ESI-IMS-TOFMS instrument was operated in the  $m/z$  range of 40 to 1500 with a  
134 total recording time of 90 s for each dataset. The Mass Spectrometer was calibrated using  
135 a mixture of quaternary ammonium salts, reserpine, and a mixture of fluorinated  
136 phosphazines (Ultramark 1621) in the positive mode and ammonium phosphate, sodium  
137 dodecyl sulfate, sodium taurocholate hydrate, and Ultramark 1621 in the negative mode.  
138 The ion mobility measurements were calibrated using tetraethyl ammonium chloride as  
139 the instrument standard and 2,4-lutidine as the mobility standard, as defined shortly  
140 (Fernández-Maestre et al., 2010). Mass spectra and ion mobility spectra were recorded  
141 using the acquisition package “Acquility” (v2.1.0, <http://www.tofwerk.com/acquility>).  
142 Post-processing was performed using the data analysis package “Tofware” (version 2.5.3,  
143 [www.tofwerk.com/tofware](http://www.tofwerk.com/tofware)) running in the Igor Pro (Wavemetrics, OR, USA)  
144 environment.



## 145 2.3 Calculations

146 The average velocity of an ion in the drift tube ( $v_d$ ) is proportional to its characteristic  
147 mobility constant ( $K / \text{cm}^2 \text{V}^{-1} \text{s}^{-1}$ ) and the electric field intensity ( $E_d$ ), provided that the  
148 field is weak (McDaniel and Mason, 1973):

$$149 \quad v_d = K E_d \quad (1)$$

150 Experimentally, ion mobility constants can be approximated from the time of ion clouds  
151 spent in the drift tube ( $t_d / \text{s}$ ), given by the rearranged form of Equation (1):

$$152 \quad t_d = \frac{1}{K} \frac{L_d^2}{V_d} \quad (2)$$

153 where  $L_d$  (cm) is the length of the drift tube and  $V_d$  (V) is the drift voltage. In the present  
154 study, drift time measurements were carried out at six different drift voltages ranging  
155 from 5 kV to 8 kV in  $\sim 1019 \text{ mbar}$  of nitrogen gas at 340 K (Figure S1 in the  
156 supplement). The ion mobility constant ( $K$ ) is derived by linear regression of the recorded  
157 arrival time ( $t_a$ ) of the ion clouds at the detector versus the reciprocal drift voltage:

$$158 \quad t_a = \frac{L_d^2}{K} \frac{1}{V_d} + t_0 \quad (3)$$

159 Note that the arrival time was determined from the centroid of the best-fit Gaussian  
160 distribution, see Figure S2 in the Supplement. The y-intercept of the best-fit line  
161 represents the transport time of the ion from the exit of the drift tube to the MS detector  
162 ( $t_0$ ), which exhibits strong  $m/z$  dependency that is attributable to a time-of-flight  
163 separation in the ion optics, see Figure S3 in the Supplement.

164 It is practical to discuss an ion's mobility in terms of the reduced mobility constant  
165 ( $K_0$ ), defined as:

$$166 \quad K_0 = K \frac{273.15}{T} \frac{P}{1013.25} \quad (4)$$

167 where  $P$  (mbar) is the pressure in the drift region and  $T$  (K) is the buffer gas temperature.  
168 In theory, the parameter  $K_0$  is constant for a given ion in a given buffer gas and can be  
169 used to characterize the intrinsic interactions of that particular ion-molecule pair. In  
170 practice, however,  $K_0$  values from different measurements might not be in good



171 agreement, primarily due to uncertainties in instrumental parameters such as  
 172 inhomogeneities in drift temperature and voltage (Fernández-Maestre et al., 2010). In  
 173 view of these uncertainties, the instrument standard (the reduced mobility of such a  
 174 standard is not affected by contaminants in the buffer gas) is needed to provide an  
 175 accurate constraint on the instrumental parameters, such as voltage, drift length, pressure,  
 176 and temperature:

$$177 \quad K_0 \times t_d = \frac{L_d^2}{V_d} \frac{P}{1013.25} \frac{273.15}{T} = C_i \quad (5)$$

178 Tetraethyl ammonium chloride (TEA) is used here as the instrument standard  
 179 (Fernández-Maestre et al., 2010). Given the well-known  $K_0$  and measured  $t_d$  of the  
 180 protonated TEA ion ( $m/z = 130$ ), Equation (5) yields an instrument constant  $C_i$   
 181 to calibrate the IMS performance.

182 Unlike TEA, the reduced mobility of species that are more likely to cluster with  
 183 contaminants can be significantly affected by impurities of the buffer gas. This category  
 184 of species can be used as a ‘mobility standard’ to qualitatively indicate the potential  
 185 contamination in the buffer gas. 2,4-Lutidine, with a well-characterized  $K_0$  value of 1.95  
 186  $\text{cm}^2 \text{V}^{-1} \text{s}^{-1}$ , is used as such a mobility standard. As shown Figure S4 in the Supplement,  
 187 the measured mobility of 2,4-Lutidine is 1.5% lower than its theoretical value, indicative  
 188 of the absence of contaminations in the buffer gas.

189 In the low field limit, the collision cross section of an ion ( $\Omega$ ) with a buffer gas is  
 190 related to its reduced mobility ( $K_0$ ) through the modified zero field (so called Mason-  
 191 Schamp) equation (McDaniel and Mason, 1973; Siems et al., 2012):

$$192 \quad \Omega = \frac{3ze}{16N_0} \left( \frac{2\pi}{k_B \mu T_0} \right)^{1/2} \frac{1}{K_0} \left[ 1 + \left( \frac{\beta_{MT}}{\alpha_{MT}} \right)^2 \left( \frac{v_d}{v_T} \right)^2 \right]^{-1/2} \quad (6)$$

193 where  $z$  is the net number of integer charges on the ion,  $e$  is the elementary charge,  $N_0$  is  
 194 the number density of buffer gas at 273 K and 1013 mbar,  $k_B$  is the Boltzmann constant,  
 195  $\mu$  is the reduced mass for the molecule-ion pair,  $T_0$  is the standard temperature,  $v_d$  is the  
 196 drift velocity given by Equation (1),  $v_T$  is the thermal velocity, and  $\alpha_{MT}$  and  $\beta_{MT}$  are  
 197 correction coefficients for collision frequency and momentum transfer, respectively,  
 198 given by:



$$199 \quad \alpha_{\text{MT}} = \frac{2}{3} [1 + \hat{m}f_c + \hat{M}f_h] \quad \beta_{\text{MT}} = \left[ \frac{2}{\hat{m}(1 + \hat{m})} \right]^{1/2} \quad (7)$$

200 where  $\hat{m}$  and  $\hat{M}$  are mass fractions of the ion and buffer gas molecule, respectively, and  $f_c$   
 201 and  $f_h$  are the fractions of collisions in the cooling and heating classes, respectively. Note  
 202 that the reduced electric field used in this study is maximized at  $\sim 2$  Td, at which the drift  
 203 velocity of any given ion is  $\sim$  two orders magnitude lower than its thermal velocity, thus  
 204 the values for  $f_c$  and  $f_h$  are assigned to be 0.5 and 0.5, respectively. As all measurements  
 205 in this study were carried out with nitrogen as the buffer gas, the reported collision cross  
 206 sections will be referred to  $\Omega_{\text{N}_2}$ . Experimental  $\Omega_{\text{N}_2}$  values for a selection of ionic species  
 207 are consistent with those reported in literatures (see Table S1 in the Supplement).

208

### 209 3. Collision Cross Section Modeling

210 Kinetic theory indicates that the quantity  $\Omega$  is an orientationally averaged collision  
 211 integral ( $\Omega_{\text{avg}}^{(1,1)}$ ), which depends on the nature of ion-neutral interaction potential  
 212 (McDaniel and Mason, 1973). Given the potential, the collision integral can be calculated  
 213 through successive integrations over collision trajectories, impact parameters and energy.  
 214 Here we adopt two computational methods, i.e., trajectory method and core model, to  
 215 simulate the average collision integral. The trajectory method is a rigorous calculation of  
 216  $\Omega_{\text{avg}}^{(1,1)}$  by propagating classical trajectories of neutral molecules in a realistic neutral/ion  
 217 potential consisting of a sum of pairwise Lennard-Jones interactions and ion induced  
 218 dipole interactions (Mesleh et al., 1996; Shvartsburg and Jarrold, 1996). The core model  
 219 treats the polyatomic ion as a rigid sphere where the center of charge is displaced from  
 220 the geometry center. The ion-neutral interaction is approximately represented by the cross  
 221 section of two rigid spheres during elastic collisions. The (12,4) potential, which includes  
 222 a long-range polarization term and a short-range repulsion term, is incorporated in the  
 223 core model (Mason et al., 1972).

224 The two models employed here represent opposite directions in the  $\Omega_{\text{avg}}^{(1,1)}$  computation  
 225 methods. The trajectory method is a rigorous calculation of  $\Omega_{\text{avg}}^{(1,1)}$  in a realistic  
 226 intermolecular potential yet the computation is time consuming. The core model, on the



227 other hand, substantially simplifies the calculation of  $\Omega_{\text{avg}}^{(l,1)}$  as rigid sphere collisions at the  
 228 expense of simulation accuracy. We will show shortly that the core model is used for  
 229 locating individual chemical classes on the 2-D  $\Omega_{\text{N}_2} - m/z$  space. Within the band  
 230 developed by each chemical class, molecular structure information can be deduced by  
 231 comparing the measured collision cross section with those calculated by the trajectory  
 232 method.

### 233 3.1 Trajectory Method

234 Molecular structures for L-leucine and D-isoleucine were initially constructed by  
 235 Avogadro v1.1.1 (Hanwell et al., 2012). For each molecule, both protonation and  
 236 deprotonation sites are created by placing a positive charge on the N-terminal amino  
 237 group and a negative charge on the C-terminal carboxyl group, respectively. The  
 238 geometry of each ion is further optimized using the Hartree-Fock method with the 6-  
 239 31G(d,p) basis set via GAMESS (Schmidt et al., 1993). Partial atomic charges were  
 240 estimated using Mulliken population analysis.

241 A freely available software, MOBCAL, developed by Jarrold and coworkers  
 242 (<http://www.indiana.edu/~nano/software.html>) was used for computing the collision  
 243 integrals. The potential term employed in the trajectory method takes the form:

$$244 \quad \Phi(\theta, \phi, \gamma, b, r) = 4\epsilon \sum_i^n \left[ \left( \frac{\sigma}{r_i} \right)^{12} - \left( \frac{\sigma}{r_i} \right)^6 \right] - \frac{\alpha_p}{2} \left( \frac{ze}{n} \right)^2 \left[ \left( \sum_i^n \frac{x_i}{r_i^3} \right)^2 + \left( \sum_i^n \frac{y_i}{r_i^3} \right)^2 + \left( \sum_i^n \frac{z_i}{r_i^3} \right)^2 \right] \quad (8)$$

245 where  $\theta$ ,  $\phi$ , and  $\gamma$  are three angles that define the geometry of ion-neutral collision,  $b$  is  
 246 the impact parameter,  $\epsilon$  is the depth of the potential well,  $\sigma$  is the finite distance at which  
 247 the interaction potential is zero,  $\alpha_p$  is the polarizability of the neutral, which is  $1.710 \times 10^{-24}$   
 248  $\text{cm}^3$  for  $\text{N}_2$  (Olney et al., 1997),  $n$  is the number of atoms in the ion, and  $r_i$ ,  $x_i$ ,  $y_i$ , and  $z_i$   
 249 are coordinates that define the relative positions of individual atoms with respect to the  
 250 buffer gas. Values of the Lenard-Jones parameters,  $\epsilon$  and  $\sigma$ , are taken from the universal  
 251 force field (Casewit et al., 1992). The ion-quadruple interaction and the orientation of  $\text{N}_2$   
 252 molecule are not considered here (Kim et al., 2008; Campuzano et al., 2012).



## 253 3.2 Core Model

254 The core model, consisting of a (12-4) central potential displaced from the origin, is  
 255 used to represent interactions of polyatomic ions with N<sub>2</sub> molecules (Mason et al., 1972).  
 256 The central potential includes the common long-range  $r^{-4}$  polarization energy, as well as  
 257 the short-range  $r^{-12}$  overlap repulsion energy:

$$258 \quad \Phi(r) = \frac{\epsilon}{2} \left\{ \left( \frac{r_m - a}{r - a} \right)^{12} - 3 \left( \frac{r_m - a}{r - a} \right)^4 \right\} \quad (9)$$

259 where  $r$  is the distance between the ion-neutral geometric centers,  $a$  is the location of the  
 260 ionic center of charge measured from the geometrical center of the ion, and  $r_m$  is the  
 261 value of  $r$  at the potential minimum. At temperature of 0 K, the *polarization potential* can  
 262 be expressed as:

$$263 \quad \Phi_{\text{pol}}(r) = -\frac{e^2 \alpha_p}{2r^4} \quad (10)$$

264

265 where  $\alpha_p$  is the polarizability of the neutral. Thus  $\epsilon$  is given by:

$$266 \quad \epsilon = \frac{e^2 \alpha_p}{3(r_m - a)^4} \quad (11)$$

267 The collision cross section can be expressed in dimensionless form by extracting its  
 268 dependence on  $r_m$ :

$$269 \quad \Omega = \Omega^{(1,1)*} \pi r_m^2 \quad (12)$$

270 Tabulations of the dimensionless collision integral ( $\Omega^{(1,1)*}$ ) can be found in literatures  
 271 (Mason et al., 1972) as a function of dimensionless temperature ( $T^*$ ) and core diameter  
 272 ( $a^*$ ), given by:

$$273 \quad T^* = \frac{kT}{\epsilon} = \frac{3kT(r_m - a)^4}{e^2 \alpha_p} \quad a^* = \frac{a}{r_m} \quad (13)$$

274 Polynomial interpolation of the tabulated  $\Omega^{(1,1)*}$  yielded an analytical expression of the  
 275 collision cross section, with  $r_m$  and  $a$  as adjustable parameters. This expression was then  
 276 fit to the ion mobility datasets measured in N<sub>2</sub> buffer gas using a nonlinear least-square



277 regression procedure (Matlab code is available upon request) (Johnson et al., 2004; Kim  
278 et al., 2005; Kim et al., 2008). Best-fit parameters,  $r_m$  and  $a$ , along with predicted vs.  
279 measured collision cross section are given in Table S2 in the Supplementary Information.

280

#### 281 4. Collision Cross Section vs. Mass-to-Charge Ratio 2-D Space

##### 282 4.1 Distribution of *multi*-Functional Organic Species

283 Figure 1 (A) shows the distribution of organic species, classified as (*di/poly/sugar*)-  
284 alcohol, *tertiary*-amine, *quaternary*-ammonium, (*mono/di*)-carbonyl, (*mono/di/tri*)-  
285 carboxylic acid, (*di*)-ester, organic sulfate, and *multi*-functional compounds, on the  
286 collision cross section vs. mass-to-charge ratio ( $\Omega_{N_2} - m/z$ ) 2-D space. Note that analytes  
287 that are detected in different ion modes (+/-) are plotted separately. One feature of the  
288 distribution pattern is that species with higher density as pure liquids and carbon  
289 oxidation state tend to occupy the lower region of the  $\Omega_{N_2} - m/z$  space. This is not  
290 surprising given that molecules of smaller collision cross sections tend to be much  
291 denser, and potentially more functionalized, than those with extended and open  
292 geometries. Furthermore, species of the same chemical class tend to occupy a narrow  
293 region and follow a trend line on the  $\Omega_{N_2} - m/z$  space. These observations form the basis  
294 of potentially utilizing locations and trends on the 2-D space to identify chemical classes  
295 to which an unknown compound belongs.

296 Small molecules ( $m/z < 200$ ) with similar size and geometry are situated closely  
297 together, as visualized by the ‘overlaps’ on the space. Improved visual separation of the  
298 species within the overlapping region is obtained by transforming  $\Omega_{N_2}$  to a quantity  
299  $\Delta\Omega_{N_2}$ , defined as the percentage difference between the measured collision cross section  
300 for any given molecular ion and the calculated projection area for a rigid spherical ion- $N_2$   
301 pair with the same molecular mass. A density of  $1.2 \text{ g cm}^{-3}$ , which represents the average  
302 bulk density of ambient organic aerosol (Turpin and Lim, 2001), is used as the reference  
303 value. Since this idealized ion- $N_2$  pair does not account for interaction potentials and  
304 molecular conformation, it is only used as a reference state to improve visualization of  
305 the  $\Omega_{N_2} - m/z$  2-D space, as shown in Figure 1 (B).



306 It is important to note that if these ‘overlapping’ molecules belong to different  
307 chemical classes, they can be resolved based on the fragmentation pattern or  
308 characteristic fragments upon collision induced dissociation (CID), as discussed in detail  
309 in Section 4.3. Also note that isomeric and isobaric species can be identified by  
310 comparing the measured collision cross sections with those obtained from trajectory  
311 method simulations, see Section 4.4. As it is highly unlikely that two distinct molecules  
312 will produce identical IMS, MS, as well as CID-based MS spectra, the 2-D framework  
313 therefore virtually ensures reliable identification of compounds.

314 Reactions involving changes in functionalization and fragmentation can be represented  
315 by an intrinsic directionality on the  $\Omega_{N_2} - m/z$  space, as illustrated by the distribution  
316 pattern of carboxylic acid series shown in Figure 2. Addition of one carbon always leads  
317 to an increase in mass and collision cross section, with a generic slope of approximately 5  
318  $\text{Å}^2/\text{Th}$ . Although the addition of one oxygen in the form of a carbonyl group results in a  
319 similar increase in the molecular mass, it leads to a shallower slope compared with that  
320 from expanding the carbon chain. Addition of carboxylic or hydroxyl groups leads to a  
321 substantial decrease in the collision cross section, due to the formation of a cyclic  
322 conformation by the intramolecular hydrogen bonding ( $\text{O} - \text{H} \cdots \text{O}^-$ ).

#### 323 4.2 $\Omega_{N_2} - m/z$ Trend Lines

324 The  $\Omega_{N_2} - m/z$  trend line visualized on the 2-D space describes the intrinsic increase  
325 in collision cross sections resulting from the increase in molecular mass by extending the  
326 carbon backbone or adding functional groups. It has been used for conformation space  
327 separation of different classes of biomolecules including lipids, peptides, carbohydrates,  
328 and nucleotides (McLean et al., 2005). Here we demonstrate for the first time the  
329 presence of trend lines for small molecules of atmospheric interest, and the trend line  
330 pattern for each chemical class can be predicted by the core model simulations.

331 Figure 3 shows the measured  $\Omega_{N_2}$  as a function of mass-to-charge ratio for (A)  
332 *tertiary*-amine and *quaternary*-ammonium, (B) (*di/poly/sugar*)-alcohol, and (C)  
333 (*mono/oxo/hydroxy*)-carboxylic acid. Also shown are the predicted  $\Omega_{N_2}$  by the core  
334 model, with adjustable parameters optimized by the measured  $\Omega_{N_2}$  for the subcategory



335 spanning the largest  $m/z$  range in each chemical class. Specifically, *quaternary-*  
336 ammonium, propylene glycol, and *alkanoic-acid* are used in constraining the core model  
337 performance to predict the  $\Omega_{N_2} - m/z$  trend lines for amines, alcohols, and carboxylic  
338 acids. Species in each chemical class, regardless of the variety in the carbon skeleton  
339 structure, occupy a narrow range and appear along a  $\Omega_{N_2} - m/z$  trend line. Such a  
340 relationship can be further demonstrated by the goodness of the core model predictions,  
341 i.e., the difference between predicted and measured  $\Omega_{N_2}$  for compounds that are not used  
342 to optimize the core model performance. For amine series, predicted  $\Omega_{N_2}$  values for  
343 lutidine and pyridine are 8.2% and 0.8% higher, respectively, than the measurements. For  
344 alcohol series, the best-fit  $\Omega_{N_2} - m/z$  trend line constrained by propylene glycol can be  
345 used to predict the distribution of sugars and polyols within 3.5% difference on the space.  
346 For carboxylic acid series, hydroxyl-hexadecanoic acid falls closely on the predicted  
347  $\Omega_{N_2} - m/z$  trend line, despite the presence of an alcohol group on the C<sub>16</sub> carbon chain.  
348 Predicted  $\Omega_{N_2}$  values for *oxo-carboxylic acids* are 4.4% – 6.1% lower than the  
349 observations. Benzoic acid exhibits a relatively large measurement-prediction gap (6.7%)  
350 potentially due to the presence of an aromatic ring.

351 Overall, the demonstrated  $\Omega_{N_2} - m/z$  trend lines for carboxylic acids, amines, and  
352 alcohols provide a useful tool for classification of structurally related compounds on the  
353 space. It is worth noting that the core model optimization and simulation can be certainly  
354 extended to other functionalities with the availability of chemical standards. Mapping out  
355 the locations and distribution patterns for various functionalities on the 2-D space would  
356 greatly facilitate structural identification of unknown compounds of atmospheric interest.

#### 357 4.3 Molecular Structure Elucidation of *multi-Functional Species*

358 The demonstrated  $\Omega_{N_2} - m/z$  relationship provides a useful tool to identify the  
359 chemical class to which an unknown species belongs. To further identify its molecular  
360 structure, knowledge on the electrospray ionization mechanism for the generation of  
361 *quasi-molecular ions*, as well as fragmentation patterns of the molecular ion upon  
362 collision induced dissociation (CID), is required.



363 For species investigated in this study, the positive mass spectra collected for amines  
364 and amino acids show major ions at  $m/z$  values corresponding to the protonated cations  
365 ( $[M+H]^+$ ). Sodiated clusters ( $[M+Na]^+$ ) of esters were observed as the dominant peak in  
366 the ESI(+) spectra. Aromatic aldehydes combine with a methyl group ( $[M+CH_3]^+$ ) via the  
367 gas-phase aldol reaction between protonated aldehydes and methanol in the positive  
368 mode. Sugars and polyols can be readily ionized in both positive and negative mode with  
369 the addition of a proton or sodium ion or deprotonation. Extensive formation of  
370 oligomers is observed from the positive mass spectra of propylene glycol, with the  
371 deprotonated propanol ( $-OCH_2CH(CH_3)-$ ) as the primary building block. Monoanions  
372 ( $[M-H]^-$ ) were exclusively observed in the negative mass spectra of (*mono/di/tri/multi*)-  
373 carboxylic acids due to the facile ionization afforded by the carboxylic group. An  
374 exhibition of molecular formulas of ionic species is given in Table 1.

375 The instrument used in this study enables the collision induced dissociation of the  
376 abovementioned precursor ions after ion mobility separation but prior to the mass  
377 spectrometer (IMS-CID-MS). As a consequence, product ions exhibit the identical  
378 mobility (drift time) with that of the precursor ion. IMS-CID-MS spectra for individual  
379 compounds are then generated by the extraction of “mobility-selected” MS spectra that  
380 contain both precursor and fragments. The major advantage of this approach is that it is  
381 possible to obtain fragmentation spectra for all precursor ions simultaneously. This is in  
382 contrast to MS/MS techniques which require the isolation of a small mass window prior  
383 to fragmentation which can be a problem for very complex samples or time-resolved  
384 analysis. Figure 4 shows the measured drift time for the precursor and product ions  
385 generated from species representative of amines, aldehydes, carboxylic acids, esters, and  
386 nitro compounds. Collision induced dissociation patterns of these species are used to  
387 elucidate the fragmentation mechanisms for corresponding functional groups. The  
388 deprotonated carboxylic acid is known to undergo facile decarboxylation to produce a  
389 carbanion. If additional carboxylic groups are present in the molecule, combined loss of  
390 water and carbon dioxide is expected (Grossert et al., 2005). Alternatively, the presence  
391 of an  $-OH$  group adjacent to the carboxylic group would usually result in a neutral loss of  
392 formic acid (Greene et al., 2013), see the fragmentation pattern for 16-  
393 hydroxyhexadecanoic acid as an illustration. Scission of the C–O bond in the ester



394 structure or the C–O bond between the secondary/tertiary carbon and the alcoholic  
395 oxygen is observed for the ester series examined, consistent with previous studies (Zhang  
396 et al., 2015). A primary fragmentation resulting in loss of CO was evident in the spectrum  
397 of methylate derivative of protonated carbonyls (RCHOCH<sub>3</sub><sup>+</sup>) (Neta et al., 2014). The  
398 IMS-CID-MS spectrum of deprotonated 4-nitrophenol is shown as a representative of  
399 organic nitro compounds. Two dominant peaks at  $m/z$  108 and  $m/z$  92 are observed,  
400 resulting from the neutral loss of NO and NO<sub>2</sub>, respectively.

401 Signal intensities of the fragments from the CID pathway of the precursor ion depend  
402 on the collision voltage, as shown in Figure 5. At low collision voltages, the precursor  
403 ions predominate with transmission optimized at approximately 5 V potential gradient.  
404 As the collision voltage increases, the intensity of the precursor ion decreases and that of  
405 each product ion increases, eventually reaching a maximum level, and then decreases due  
406 to subsequent fragmentation. The dependence of the product ion abundance on the  
407 collision voltage provides information on the relative strength of the covalent bond at  
408 which the parent molecule fragments. Consequently, the energy required to induce a  
409 certain fragmentation pathway could potentially also serve as an additional parameter for  
410 structure elucidation. For example, the predominance of the product ion at  $m/z$  149  
411 suggests that cleavage of the O–O bond in the ester moiety is the dominant fragmentation  
412 pathway upon CID of dioctyl phthalate (C<sub>24</sub>H<sub>38</sub>O<sub>4</sub>).

413

#### 414 4.4 Resolving Isomeric Mixtures

415 Here we demonstrate the separation and identification of isomers on the  $\Omega_{N_2} - m/z$   
416 space using the mixture of L-leucine and D-isoleucine as an illustration. Leucine can be  
417 directly ionized by electrospray in both positive and negative modes due to the presence  
418 of amino and carboxyl groups. Figure 6 (A and B) shows a single peak that corresponds  
419 to the protonated ([M+H]<sup>+</sup>,  $m/z$  = 132) and deprotonated ([M–H]<sup>–</sup>,  $m/z$  = 130) forms of  
420 the leucine mixture, respectively, in the positive and negative MS spectra. Upon further  
421 separation based on their distinct mobility in the N<sub>2</sub> buffer gas, the leucine mixture is  
422 clearly resolved in the positive mode, while a broad peak is observed in the negative ion  
423 mobility spectrum, see Figure 6 (C and D). Note that a typical IMS resolving power



424 ( $t/dt_{50}$ ) of 100 leads to a baseline separation of leucine isomers that differ by 0.3 ms in the  
425 measured drift time. Figure 6 (E-H) shows the IMS spectra for individual leucine  
426 isomeric configurations, which provide precise constraints for the peak assignment in the  
427 leucine mixture. Also given here are the measured vs. predicted collision cross sections  
428 for each isomer, with predictions lower by 3.3 ~ 6.9% compared with the measurements.  
429 However, despite the underprediction, the model using trajectory method correctly  
430 predicts the relative collision cross sections of the isomers and therefore also the order in  
431 which they appear in the IMS spectrum. The underprediction of  $\Omega_{N_2}$  may result from the  
432 simplification that linear  $N_2$  molecules are considered as elastic and specular spheres in  
433 the current model configuration (Larriba-Andaluz and Hogan Jr, 2014). Further  
434 development of the model to more appropriately predict  $\Omega_{N_2}$  values is needed.

435

## 436 5. Conclusions

437 We propose a new metric, collision cross section ( $\Omega$ ), for characterizing organic  
438 species of atmospheric interest. Collision cross section represents an effective interaction  
439 area between a charged molecule and neutral buffer gas as it travels through under the  
440 action of a weak electric field, and thus relates to the chemical structure and 3-D  
441 conformation of this molecule. The collision cross section of individual molecular ions is  
442 calculated from the ion mobility measurements using an Ion Mobility Spectrometer. In  
443 this study, we provide the derived  $\Omega_{N_2}$  values for a series of organic species including  
444 amines, alcohols, carbonyls, carboxylic acids, esters, organic sulfates, and *multi-*  
445 *functional* compounds.

446 The collision cross section, when coupled with mass-to-charge ratio, provides a 2-D  
447 framework for characterizing the molecular signature of atmospheric organic aerosol.  
448 The  $\Omega_{N_2} - m/z$  space is employed to guide our fundamental understanding of processes  
449 of organic aerosol formation and evolution in the atmosphere. We show that different  
450 chemical classes tend to develop unique narrow bands with trend lines on the  $\Omega_{N_2} - m/z$   
451 space. Trajectories associated with atmospheric transformation mechanisms either cross  
452 or follow these trend lines through the space. The demonstrated  $\Omega_{N_2} - m/z$  trend lines



453 provide a useful tool for resolving various functionalities in the complex OA mixture.  
454 These intrinsic trend lines can be predicted by the core model, which provides a guide for  
455 locating unknown functionalities on the  $\Omega_{N_2} - m/z$  space.

456 Within each band that that belongs to a particular chemical class on the space, species  
457 can be further separated based on their distinct structures and geometries. We  
458 demonstrate the utility of collision induced dissociation technique, upon which the  
459 resulted product ions share the identical drift time as the precursor ion, to facilitate the  
460 elucidation of molecular structures of OA constituents. We employ the  $\Omega_{N_2} - m/z$   
461 framework for separation of isomeric mixtures as well by comparing the measured  
462 collision cross sections with those predicted using the trajectory method. Further  
463 advances in algorithms to correctly predict collision cross sections *ab initio* from  
464 molecular coordinates are therefore also expected to significantly improve identification  
465 of unknowns.

466

#### 467 **Acknowledgement**

468 This study was supported by the U.S. National Science Foundation (NSF)  
469 Atmospheric and Geospace Sciences (AGS) grants 1537446. J.E.K. was supported by  
470 fellowships from CIRES and EPA STAR (FP-91770901-0). J.L.J. was supported by DOE  
471 (BER/ASR) DE-SC0011105 and EPA STAR 83587701-0. This manuscript has not been  
472 reviewed by EPA and thus no endorsement should be inferred.

473

#### 474 **Appendix:**

475  $a$  (Å): the location of the ionic center of charge from the geometrical center of the ion.

476  $a^*$ : the dimensionless core diameter.

477  $\alpha_{MT}$ : the correction coefficient for collision frequency.

478  $\alpha_p$  (cm<sup>3</sup>): the polarizability of the neutral.

479  $\beta_{MT}$ : the correction coefficient for momentum transfer.

480  $C_i$ : the instrument constant that is used to calibrate the IMS performance.

481  $\epsilon$  (eV): the depth of the potential well.



- 482  $E_d$  (V/cm): the electric field intensity in the drift tube.  
483  $\Phi$  (eV): the ion-neutral interaction potential.  
484  $f_c$ : the fraction of collisions in the cooling classes.  
485  $f_h$ : the fraction of collisions in the heating classes.  
486  $k_B$  ( $\text{m}^2 \text{kg s}^{-2} \text{K}^{-1}$ ): Boltzmann constant.  
487  $K$  ( $\text{cm}^2 \text{V}^{-1} \text{s}^{-1}$ ): the characteristic mobility constant of a given ion.  
488  $K_0$  ( $\text{cm}^2 \text{V}^{-1} \text{s}^{-1}$ ): the reduced mobility constant of a given ion.  
489  $L_d$  (V/cm): the length of the drift tube.  
490  $\hat{m}$ : the mass fraction of the ion in the ion-molecule pair.  
491  $\hat{M}$ : the mass fraction of the buffer gas molecule ( $\text{N}_2$ ) in the ion-molecule pair.  
492  $m/z$  (Th): the mass-to-charge ratio of any given ion.  
493  $N_0$  ( $\# \text{cm}^{-3}$ ): the number density of buffer gas at 273 K and 1013 mbar.  
494  $\Omega$  ( $\text{\AA}^2$ ): the collision cross section.  
495  $\Omega_{\text{N}_2}$  ( $\text{\AA}^2$ ): the collision cross section using  $\text{N}_2$  as the buffer gas.  
496  $\Omega_{\text{avg}}^{(1,1)}$ : the orientationally averaged collision integral.  
497  $\Omega^{(1,1)*}$ : the dimensionless collision integral.  
498  $P$  (mbar): the pressure in the drift region.  
499  $r$  ( $\text{\AA}$ ): the distance between the ion-neutral geometric centers.  
500  $r_m$  ( $\text{\AA}$ ): the value of  $r$  at the potential minimum.  
501  $\sigma$  ( $\text{\AA}$ ): the finite distance at which the interaction potential is zero.  
502  $T$  (K): the buffer gas temperature.  
503  $T_0$  (K): the standard temperature.  
504  $T^*$ : the dimensionless temperature.  
505  $t_a$  (s): the recorded arrival time of the ion clouds at the detector.  
506  $t_d$  (s): the time of ion clouds spent in the drift tube.  
507  $t_0$  (s): the transport time of ion clouds from the exit of the drift tube to the MS detector.  
508  $v_d$  (s): the average velocity of an ion in the drift tube.  
509  $v_T$  ( $\text{m s}^{-1}$ ): the thermal velocity.  
510  $V_d$  (V): the voltage applied to the drift tube.  
511  $z$ : the net number of integer charges on the ion.

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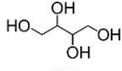
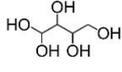
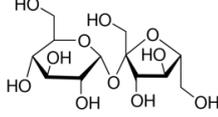
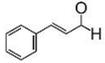
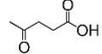
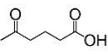
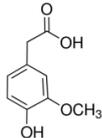
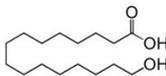
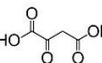
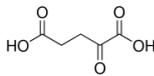
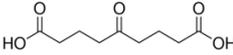
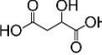
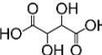
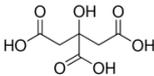
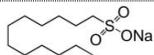
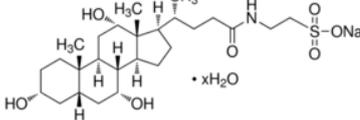
Table 1. Overview of organic standards investigated in this study.

Class	Chemical	Molecular Formula	Ion		$\Omega_{N_2}$ ( $\text{\AA}^2$ )	Molecular Structure
			Formula	$m/z$		
Amine	Tetraethyl ammonium chloride	$C_8H_{20}NCl$	$[M-Cl]^+$	130.16	122.1	
	Tetrapropyl ammonium chloride	$C_{12}H_{28}NCl$	$[M-Cl]^+$	186.10	143.8	
	Tetrabutyl ammonium iodide	$C_{16}H_{36}NI$	$[M-I]^+$	242.17	165.8	
	Tetrapentyl ammonium chloride	$C_{20}H_{44}NCl$	$[M-Cl]^+$	298.35	190.0	
	Tetraheptyl ammonium chloride	$C_{28}H_{60}NCl$	$[M-Cl]^+$	410.47	236.5	
	2,4-Lutidine	$C_7H_9N$	$[M+H]^+$	108.08	123.4	
	2,6-Di-tert-butylpyridine	$C_{13}H_{21}N$	$[M+H]^+$	192.17	145.0	
Amino acid	L-Leucine	$C_6H_{13}NO_2$	$[M+H]^+$ $[M-H]^-$	132.10 130.09	137.8 144.4	
	D-Isoleucine	$C_6H_{13}NO_2$	$[M+H]^+$ $[M-H]^-$	132.10 130.09	135.2 140.3	
mono Carboxylic Acid	Benzoic acid	$C_7H_6O_2$	$[M-H]^-$	121.03	128.6	
	Octanoic acid	$C_8H_{16}O_2$	$[M-H]^-$	143.11	144.7	
	2-Butyloctanoic acid	$C_{12}H_{24}O_2$	$[M-H]^-$	199.17	162.0	
	Tridecanoic acid	$C_{13}H_{26}O_2$	$[M-H]^-$	213.19	166.2	$CH_3(CH_2)_{10}CH_2COOH$
	Pentadecanoic acid	$C_{15}H_{30}O_2$	$[M-H]^-$	241.22	173.7	$CH_3(CH_2)_{12}CH_2COOH$
	Palmitic acid	$C_{16}H_{32}O_2$	$[M-H]^-$	255.23	177.9	$CH_3(CH_2)_{13}CH_2COOH$
	Stearic acid	$C_{18}H_{36}O_2$	$[M-H]^-$	283.26	185.4	$CH_3(CH_2)_{15}CH_2COOH$
Oleic acid	$C_{18}H_{34}O_2$	$[M-H]^-$	281.25	186.9	$CH_3(CH_2)_6CH=CH(CH_2)_7COOH$	



<i>di/multi</i> Carboxylic Acid	Succinic acid	C <sub>4</sub> H <sub>6</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	117.02	124.6	
	Glutaric acid	C <sub>5</sub> H <sub>8</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	131.03	128.4	
	Adipic acid	C <sub>6</sub> H <sub>10</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	145.05	131.5	
	Pimelic acid	C <sub>7</sub> H <sub>12</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	159.06	134.0	
	Azelaic acid	C <sub>9</sub> H <sub>16</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	187.09	143.5	
	Sebacic acid	C <sub>10</sub> H <sub>18</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	201.11	148.9	
	1,2,3-Propane tricarboxylic acid	C <sub>6</sub> H <sub>8</sub> O <sub>6</sub>	[M-H] <sup>-</sup>	175.02	122.2	
	Cyclohexane tricarboxylic acid	C <sub>9</sub> H <sub>12</sub> O <sub>6</sub>	[M-H] <sup>-</sup>	215.06	135.0	
Mellitic acid	C <sub>12</sub> H <sub>6</sub> O <sub>12</sub>	[M-H <sub>2</sub> O-H] <sup>-</sup>	322.96	154.6		
Ester	Dibutyl oxalate	C <sub>10</sub> H <sub>18</sub> O <sub>4</sub>	[M+Na] <sup>+</sup>	225.11	170.0	
	Dibutyl phtahlate	C <sub>16</sub> H <sub>22</sub> O <sub>4</sub>	[M+Na] <sup>+</sup> [2M+Na] <sup>+</sup>	301.14 579.29	192.4 255.5	
	Diocetyl phthalate	C <sub>24</sub> H <sub>38</sub> O <sub>4</sub>	[M+H] <sup>+</sup>	391.28	203.6	
Alcohol	Propylene glycol	C <sub>3</sub> H <sub>8</sub> O <sub>2</sub>	[2M-2H <sub>2</sub> O+Na] <sup>+</sup>	215.12	144.8	
			[4M-3H <sub>2</sub> O+Na] <sup>+</sup>	273.17	156.4	
			[5M-4H <sub>2</sub> O+H] <sup>+</sup>	309.23	165.7	
			[5M-4H <sub>2</sub> O+Na] <sup>+</sup>	331.21	169.6	
			[6M-5H <sub>2</sub> O+H] <sup>+</sup>	367.27	179.1	
			[6M-5H <sub>2</sub> O+Na] <sup>+</sup>	389.24	181.6	
			[7M-6H <sub>2</sub> O+H] <sup>+</sup>	425.31	190.8	
			[7M-6H <sub>2</sub> O+Na] <sup>+</sup>	447.28	193.9	
			[8M-7H <sub>2</sub> O+H] <sup>+</sup>	483.35	204.7	
			[8M-7H <sub>2</sub> O+Na] <sup>+</sup>	505.32	206.2	
			[9M-8H <sub>2</sub> O+H] <sup>+</sup>	541.39	218.5	
[9M-8H <sub>2</sub> O+Na] <sup>+</sup>	563.36	219.3				
[10M-9H <sub>2</sub> O+H] <sup>+</sup>	599.42	231.3				
[10M-9H <sub>2</sub> O+Na] <sup>+</sup>	621.40	231.8				



	DL-Threitol	C <sub>4</sub> H <sub>10</sub> O <sub>4</sub>	[M+Na] <sup>+</sup>	145.05	133.0	
	Xylitol	C <sub>5</sub> H <sub>12</sub> O <sub>5</sub>	[M-H] <sup>-</sup>	151.06	131.2	
	Sucrose	C <sub>12</sub> H <sub>22</sub> O <sub>11</sub>	[M-H] <sup>-</sup> [M+Na] <sup>+</sup>	341.11 365.11	167.6 175.1	
	Hexane-3,4-dione	C <sub>6</sub> H <sub>10</sub> O <sub>2</sub>	[M+H] <sup>+</sup> [M+CH <sub>3</sub> ] <sup>+</sup>	115.08 129.09	115.7 121.3	
Carbonyl	Acetophone	C <sub>8</sub> H <sub>8</sub> O	[M+CH <sub>3</sub> ] <sup>+</sup>	135.08	120.4	
	Cinnamaldehyde	C <sub>9</sub> H <sub>8</sub> O	[M+CH <sub>3</sub> ] <sup>+</sup>	147.08	123.9	
	Levulinic acid	C <sub>5</sub> H <sub>8</sub> O <sub>3</sub>	[M-H] <sup>-</sup>	115.04	130.0	
	4-Acetylbutyric acid	C <sub>6</sub> H <sub>10</sub> O <sub>3</sub>	[M-H] <sup>-</sup>	129.06	134.5	
	Homovanillic acid	C <sub>9</sub> H <sub>10</sub> O <sub>4</sub>	[M-H] <sup>-</sup>	181.05	147.7	
	16-Hydroxy hexadecanoic acid	C <sub>16</sub> H <sub>32</sub> O <sub>3</sub>	[M-H] <sup>-</sup>	271.22	183.7	
<i>multi</i> Functional Compound	Oxaloacetic acid	C <sub>4</sub> H <sub>4</sub> O <sub>5</sub>	[M-H] <sup>-</sup>	131.06	118.3	
	Ketoglutaric acid	C <sub>5</sub> H <sub>6</sub> O <sub>5</sub>	[M-H] <sup>-</sup>	145.01	120.9	
	Oxozelaic acid	C <sub>9</sub> H <sub>14</sub> O <sub>5</sub>	[M-H] <sup>-</sup>	201.08	133.3	
	Malic acid	C <sub>4</sub> H <sub>6</sub> O <sub>5</sub>	[M-H] <sup>-</sup>	133.01	111.4	
	Tartaric acid	C <sub>4</sub> H <sub>6</sub> O <sub>6</sub>	[M-H] <sup>-</sup>	149.01	116.0	
	Citric acid	C <sub>6</sub> H <sub>8</sub> O <sub>7</sub>	[M-H] <sup>-</sup>	191.02	123.0	
	Sodium Dodecyl sulfate	C <sub>12</sub> H <sub>25</sub> SO <sub>4</sub> Na	[M-Na] <sup>-</sup>	265.15	163.6	
Organic Sulfate	Sodium Taurocholate	C <sub>26</sub> H <sub>44</sub> SO <sub>7</sub> NNa	[M-Na] <sup>-</sup>	514.28	206.4	

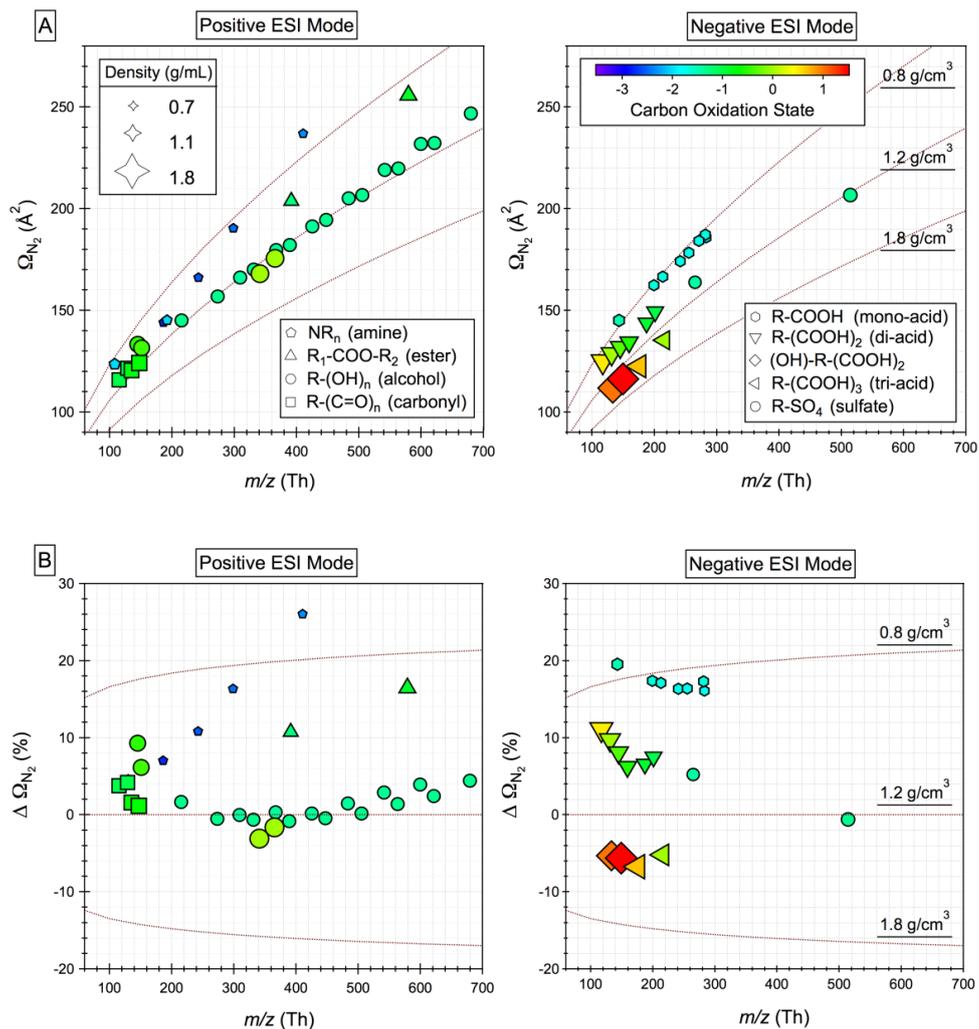


Figure 1. Distribution of organic species including alcohol ( $\text{R-(OH)}_n$ ,  $n = 2-8$ ), amine ( $\text{NR}_3$ ), *quaternary-ammonium* ( $\text{NR}_4$ ), carbonyl ( $\text{R-(C=O)}_n$ ,  $n = 1-2$ ), carboxylic acid ( $\text{R-(COOH)}_n$ ,  $n = 1-3$ ), ester ( $\text{R}_1\text{-COO-R}_2$ ), organic sulfate ( $\text{R-SO}_4$ ), and *multi-functional* compounds ( $(\text{OH})\text{-R-(COOH)}_2$ ) on the (A)  $\Omega_{N_2} - m/z$  space and (B)  $\Delta \Omega_{N_2} - m/z$  space.

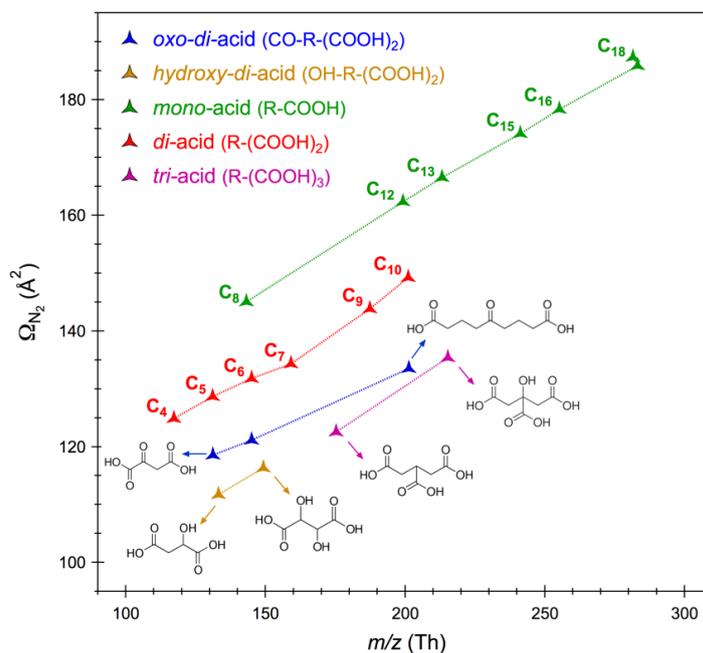


Figure 2. Trajectories associated with reactions involving functionalization (changes in the type and number of functional groups) and fragmentation (changes in the carbon chain length) through the 2-D  $\Omega_{N_2} - m/z$  space using carboxylic acid series as an illustration.

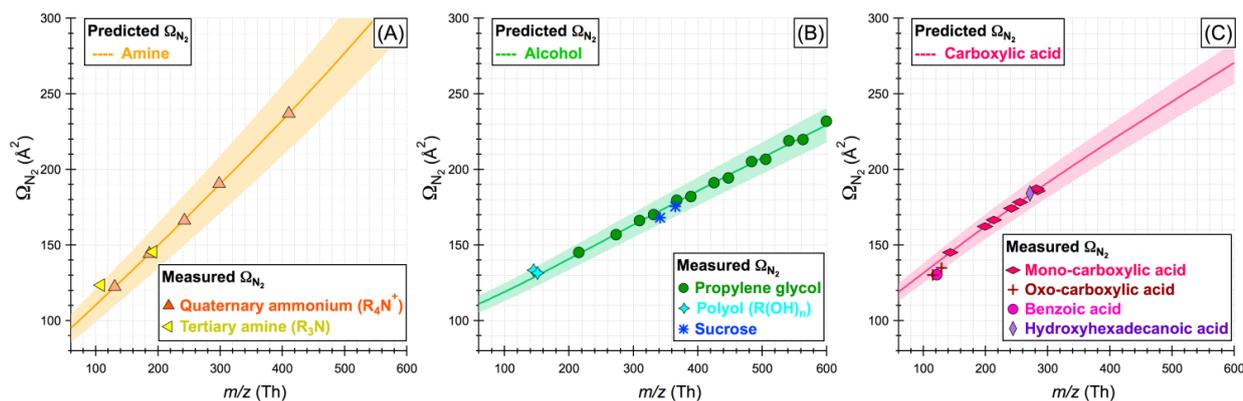


Figure 3. Measured collision cross sections ( $\Omega_{N_2}$ ) for (A) tertiary-amine and quaternary-ammonium, (B) (di/poly/sugar)-alcohol, and (C) (mono/oxo/hydroxy)-carboxylic acid as a function of the mass-to-charge ratio. Also shown are the predicted  $\Omega_{N_2} - m/z$  trend lines for amine, alcohol, and carboxylic acid by the core model. Here, quaternary-ammonium, propylene glycol, and  $C_8$ - $C_{18}$  alkanolic-acid are used to optimize the adjustable parameters in the core model (The markers are in the same color as the trend lines). The colored shade in each figure represents the maximum deviations (8.21%, 3.54%, and 6.69% for amine, alcohol, and carboxylic acid, respectively) of the predicted  $\Omega_{N_2}$  from the measured  $\Omega_{N_2}$  for species that are not used to constrain the core model. A single plot showing the separation of these three chemical classes is given in Figure S5 in the supplement.

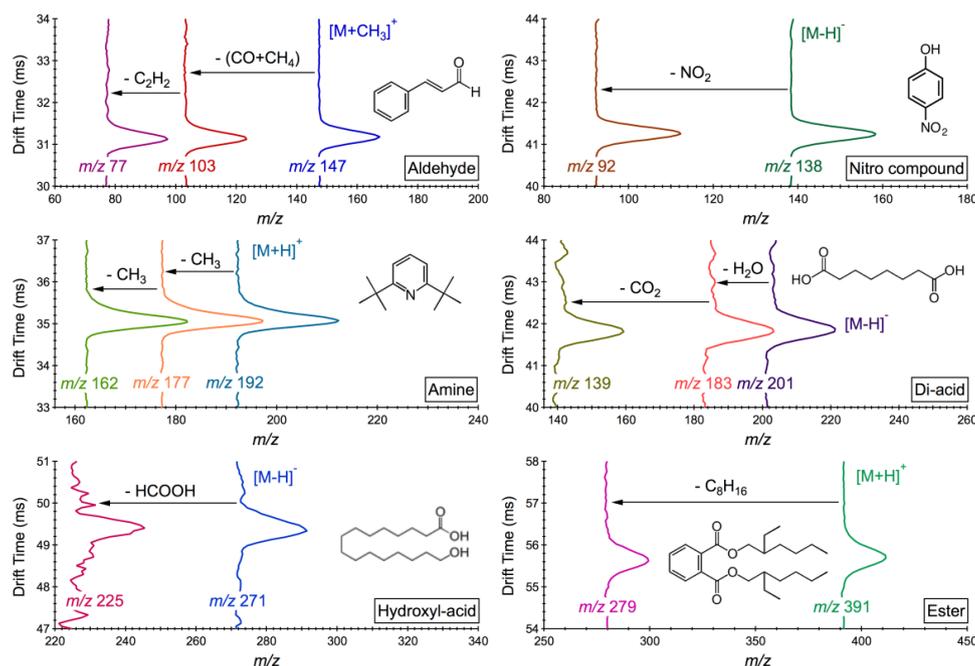


Figure 4. Collision induced dissociation patterns for molecular ions generated from cinnamaldehyde, dioctyl phthalate, 2,6-di-tert-butylpyridine, 4-nitrophenol, 16-hydroxyhexadecanoic acid, and sebacic acid on the mobility – mass framework with mass-to-charge ratio on the  $x$ -axis and drift time on the  $y$ -axis. The corresponding mobility selected MS spectra for each species is given in Figure S6 in the supplement.

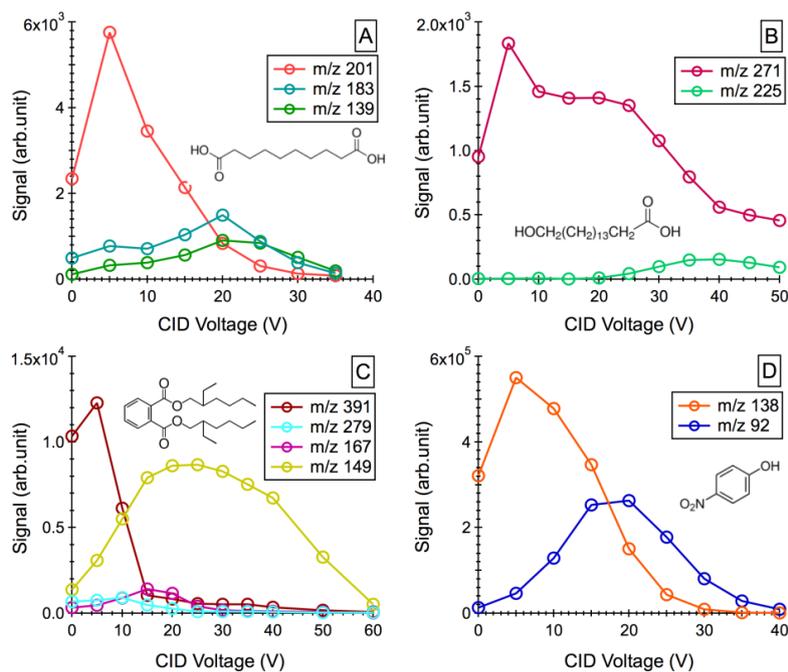


Figure 5. Product ion peak intensities as a function of collision voltage in the ‘mobility-selected’ MS spectra of (A) deprotonated sebacic acid, (B) deprotonated 16-hydroxyhexadecanoic acid, (C) sodiated dioctyl phthalate, and (D) deprotonated 4-nitrophenol.

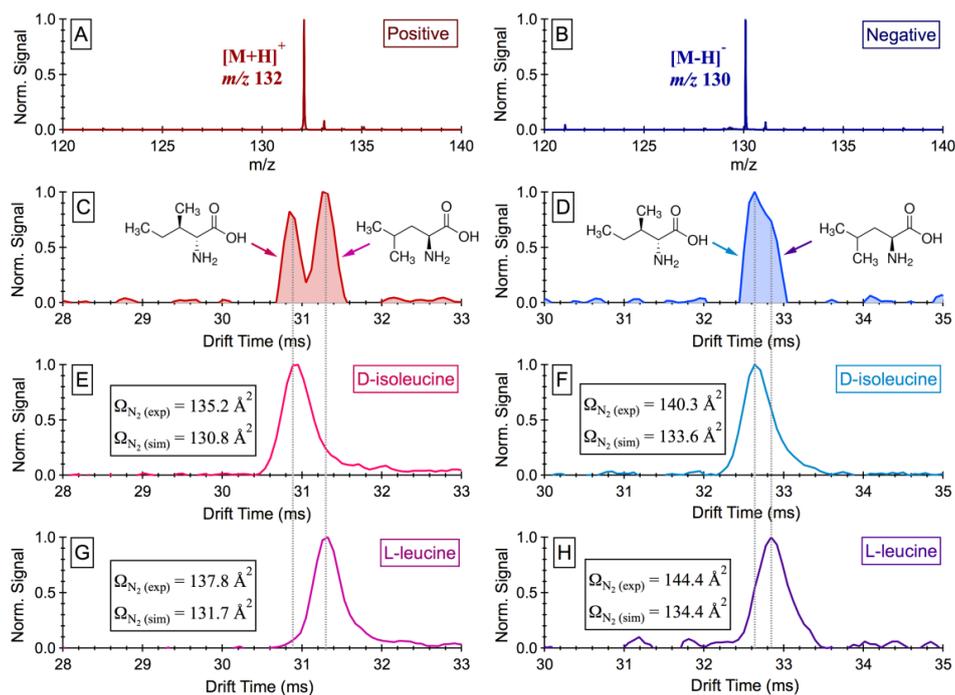


Figure 6. (A/B) ESI mass spectra collected for an equi-molar mixture (20  $\mu\text{M}$  each) of L-leucine and D-isoleucine in positive and negative mode. (C/D) Measured drift time distributions for the leucine mixture in positive and negative mode. (E/F) Measured vs. predicted  $\Omega_{N_2}$  for D-isoleucine, together with its drift time distributions in positive and negative mode. (G/H) Measured vs. predicted  $\Omega_{N_2}$  for L-leucine, together with its drift time distributions in positive and negative mode. Note that all measurements were performed at  $\sim 303 \text{ K}$  and  $\sim 1019 \text{ mbar}$  with an electric field strength of 414 and 403  $\text{V cm}^{-1}$  in the positive and negative mode, respectively.