

MOLECULAR CHARACTERIZATION OF DISSOLVED ORGANIC MATTER IN SÃO  
PAULO, BRAZIL WET DEPOSITION BY ULTRA-HIGH RESOLUTION MASS  
SPECTROMETRY

A Thesis

by

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May 2022

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This thesis meets the standards for scope and quality of  
Texas A&M University-Corpus Christi and is hereby approved.

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## ABSTRACT

Rainwater dissolved organic matter (DOM) is a complex mixture of organic compounds, the composition of which remains to a large extent unknown. This is despite its central role in a host of fundamentally important atmospheric processes (e.g. aerosol hygroscopicity, light absorption, etc.). The molecular composition of DOM has been used to infer emission sources and investigate atmospheric reactions that produce secondary organic aerosols (SOA), which comprise the main contributor of uncharacterized compounds in rainwater organics. This work illustrates the molecular composition of DOM in rainwater collected from February 2020 to June 2021 ( $n = 32$  of rain samples) in Ribeirão Preto, SP (21.166 S, 47.845 W) using complimentary methods of traditional ion chromatography cooperatively with Orbitrap mass spectrometry and novel statistical analysis. This approach provides a detailed, ultra-high resolution, high-throughput method for future rainwater DOM investigations which is demonstrated here with direct-injection, positive mode electrospray ionization. Using this method, 41,383 total molecular formulas in 32 samples were identified over the mass range  $m/z^+$  range of 80 to 800; among them 2,788 molecular formulas were unique. DOM character in São Paulo rainwater is revealed to be largely influenced by organic nitrogen, as 2,397 of the unique formulas identified contained nitrogen. This represents 86.0% of the total variety of organic compounds identified, with many of these likely peptides or amino acid derivatives. These findings also show that in terms of variety and number the general proportions of elemental formula classes remain relatively consistent over many samples, but the composition of the individual classes varies as function of its constituent emission sources. Recent pandemic related influences on anthropogenic activity as well as biomass burning in the São Paulo region of Brazil are seen through variations in rainwater DOM characteristics. Rainwater collected prior to the COVID-19 pandemic's

emergence in Brazil is distinct from reduced anthropogenic activity rainwater in both DOM character—seen in the increase in primary compounds and direct amino acid contribution, wider range of O:C ratios, and the absence of atmospheric NO<sub>x</sub> related CHON oligomers—and major ion content—marked by a reduction in sulfate, nitrate, potassium, and formate. Clustering analysis shows that these distinctions are mostly driven by changes in anthropogenic reactive nitrogen emissions as well as in part to seasonal influence. This research highlights the potential for public policy to reduce the emission of air pollutants and other biologically relevant anthropogenic emissions, particularly through reducing traffic loading and expanding remote working.

## DEDICATION

This master's thesis is dedicated to Dr. Adele Hite, who has been a key foundation to my academic journey and a beloved aunt.

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## CHAPTER I. INTRODUCTION

Atmospheric OM—also referred to as aerosols—is a major component of both marine and continental rainwater<sup>1,2</sup> that influences climate, air quality, and ecosystem health<sup>3–5</sup> and is generated by a variety of anthropogenic and biogenic emission sources. The molecular composition of atmospheric OM results from its emission source and aging processes.<sup>6</sup> Its molecular composition will, in part, determine its impacts on properties such as light absorption,<sup>7</sup> aerosol hygroscopicity,<sup>8,9</sup> and bioavailability upon deposition.<sup>10,11</sup> These properties define the role atmospheric OM plays in regulating climate through direct and indirect effect in both radiative forcing and cloud seeding,<sup>4,5,12,13</sup> as well as its role in nutrient loading.<sup>14,15</sup> Certain aerosols can supply nutrients that stimulate net ecosystem growth or, alternatively, toxins that suppress a biogeochemical cycle.<sup>5</sup> Acidic aerosols (such as sulfates or nitrates) deposit over terrestrial ecosystems as acid rain and enhance the leaching of nutrients from the system.<sup>16</sup>

While atmospheric OM influences many natural systems, its role in air quality and public health is often the most visible. In the form of particulate matter (PM) and volatile organic compounds (VOCs)—the dominant forms of OM—it is an environmental factor that is associated with increased respiratory morbidity and mortality.<sup>17–19</sup> PM is responsible for 3.7–4.8 million premature deaths worldwide.<sup>20</sup> Of these deaths, 92% occur in low and middle income countries<sup>17,21,22</sup> and 2.8 million of these deaths are due to biomass burning for wood cookstoves.<sup>23</sup> VOCs have complex risk factors, supporting ozone production<sup>24</sup> and posing individual toxic and carcinogenic risks.<sup>25</sup> High mass concentrations of PM and VOCs are common indications of poor air quality and smog events.<sup>26,27</sup> The currently understood driving forces of PM toxicity are size fraction, mass concentration, and composition/oxidative potential.<sup>28–30</sup> While the EPA regulates PM based on mass concentration,<sup>31</sup> recent studies using

*in vitro* exposure techniques now suggest that PM mass concentration is not the causal factor in health risks and that overall PM toxicity differs from the toxicity of its individual components.<sup>32</sup> *In vitro* exposure techniques in tandem with chemical and biological characterization have begun to identify specific constituents of PM most relevant to overall toxicity.<sup>28,33,34</sup> Current research has demonstrated that secondary processing of aerosols, namely photochemical changes, result in differential *in vitro* genomic responses, suggesting an increase in overall toxicity.<sup>19,35–37</sup> For example, secondary organic aerosols (SOA) from isoprene photooxidation are demonstrated to significantly increase known inflammatory biomarkers IL-8 and COX-2 mRNA levels in human bronchial epithelial cells (BEAS- 2B).<sup>38</sup>

The many primary sources (emitted directly into the atmosphere) of atmospheric OM can be categorized as biogenic (emitted by natural systems) or anthropogenic (emitted by human activity). Biogenic primary sources are related to emissions of VOCs from vegetation, mechanically suspended biological particles (pollen, plant debris, soil, dust, bacteria, and viruses), forest fires, emissions from marine environments (sea-air gas exchange and bubble bursting action suspending OM in the sea surface microlayer), volcanoes, etc. Anthropogenic primary sources include: combustion and production of fossil and biofuels (motor vehicle exhaust, electric generation units), biomass burning, domestic heating and cooking, tire and asphalt wear, solvent use, emissions from agriculture (such as pesticides), and natural gas exploration.<sup>14</sup> Globally, primary sources are mostly biogenic in origin (80%) and are dominated by isoprene and monoterpene emissions from vegetation.<sup>39,40</sup>

At least half of global primary emissions of atmospheric OM are chemically transformed in the atmosphere to create SOA.<sup>12,41</sup> These reactions generally follow one of two pathways: degradation of large molecules by oxidation or generation of higher weight molecules through

oligomerization. Both of these pathways are mediated by oxidants and/or solar radiation.<sup>42</sup> Secondary processing of organic aerosols have seen increasing attention and study in the past decade, notably in relation to climate effects. Secondary processing bolsters OM's role as cloud condensation nuclei, incorporating OM into cloud droplets and aiding its subsequent removal through precipitation.<sup>41</sup> Precipitation removes organic compounds from atmospheric circulation with efficiency and is a major process by which balance between sources and sink of atmospheric organics is achieved.<sup>43</sup> This dissolved organic matter (DOM) has been sparsely characterized and used to investigate atmospheric reactions that produce SOA, which comprise the main contributor of uncharacterized compounds in rainwater OM.<sup>1,2</sup>

Rainwater DOM is a complex heterogeneous mixture of organic compounds, the composition of which is considered less than 50% chemically characterized.<sup>1,2</sup> Identifying the composition of organic species in atmospheric waters has been held back largely by the difficulty of analyzing species present in very low abundances in a complex matrix of thousands of unique compounds. Significant progress has been made to identify the composition of complex DOM in organic aerosols and rainwater DOM using Fourier transform ion cyclotron resonance mass spectrometry (FT-ICR MS),<sup>44-47</sup> however these methods have a low throughput and the resultant studies are limited in sample size (the highest being seven samples<sup>45</sup>). These methods also involve preconcentration usually through solid-phase extraction (SPE), which contribute to analyte loss particularly for higher oxygen content and more polar species.<sup>48-50</sup> Alternative high resolution mass analyzers in the Fourier transform family such as the Orbitrap have started to become part of routine analysis in numerous areas of research.<sup>51,52</sup> Orbitrap has been used to characterize riverine DOM and ambient aerosols,<sup>53-55</sup> and its high resolution, mass accuracy, and ability to be used in combination with other mass selection technologies make it an ideal

candidate for complex analysis and has begun to garner global attention for its application in studying environmental systems. At present however, no studies using Orbitrap MS to characterize rainwater DOM nor any high-resolution chemical characterization of DOM in South American rainwater have been published. Currently only 9–14% of the water soluble organic compounds (WSOC) have been identified in any chemical characterization study of South American aerosols.<sup>56</sup> In this present work, direct injection Orbitrap mass spectrometry was used on rainwater samples collected in Brazil to further the study on rainwater DOM and as a representation of WSOC in South American airsheds.

Primary emission sources of atmospheric OM are zonally and seasonally variable.<sup>14</sup> To that effect, the Brazilian wet season occurs during the months of October to March whereas the dry season occurs during the months of April to September. During dry seasons, wildfires and slash-and-burn agriculture makes Brazil susceptible to biomass burning influence and subsequent air quality issues.<sup>57</sup> Starting August 2019, the Amazon rainforest has seen significant increase in both area of effect and number of forest fires, mostly related to deforestation. Smoke from these fires have been observed via satellite to travel 2,700 km from the Amazon rainforest to the city of São Paulo.<sup>58</sup> These large forest fires have undoubtedly influenced OM input into the airshed.

The COVID-19 pandemic has triggered a variety of responses in Brazil from federal, state and local governments, impacting on politics, education, the environment, and the economy.<sup>59</sup> The profound impact of the pandemic response accelerated deforestation and decreased travel and industrial activity.<sup>60</sup> It is unknown how these processes influence OM input and cycling into the São Paulo airshed, but it appears likely that these influences will decrease biogenic VOCs and anthropogenic emissions. Preliminary studies into the São Paulo airshed during the COVID-19 pandemic have observed drastic reductions on NO (up to  $-77.3\%$ ), NO<sub>2</sub>

(up to  $-54.3\%$ ), and CO (up to  $-64.8\%$ ) concentrations in the urban area compared to the five-year monthly mean and to the four-week mean before the partial lockdown. As an effect, an increase of 30% in ozone concentrations was observed in urban areas highly influenced by vehicle traffic.<sup>61</sup>

In this study, a series of continental rainfall samples were collected in a typical urban and agricultural region, Ribeirão Preto, São Paulo, to study the influence of pandemic policies, biomass burning, and social isolation on the molecular composition and chemical character of DOM. This study covers the period before partial lockdown orders were issued (February 26 to March 24, 2020) through to March 2021. High-resolution Orbitrap mass spectrometry was used to characterize the specific molecular composition of rainwater DOM during this period, which was then analyzed alongside inorganic ion and select organic acid content. Potential compounds of interest along with possible emission signatures were identified using powerful statistical techniques such as principal component analysis, volcano plotting, and positive matrix factorization. Conclusions drawn from the analysis of these samples further the discussion around the role of organic nitrogen in the water-soluble fraction of organic aerosols.

## CHAPTER II. METHODS

### 2.1 Study Site and Description

#### Ribeirão Preto, São Paulo, Brazil

The state of São Paulo, Brazil is in the southeast Brazil subtropical region bordering the Atlantic Ocean. The state has an area of  $248 \times 108 \text{ km}^2$ .<sup>15</sup> São Paulo is the largest state in Brazil, with a population of 45,919,049 people, and a total of 29,057,749 vehicles. Its capital, São Paulo, is the largest city in Latin America, with a population of 12,252,023 people, and an urbanization rate of 99.1%.<sup>62</sup> São Paulo has important agriculture and industrial economic sectors as well as defined wet and dry seasons.<sup>15</sup> The agro-industries, metallurgical, food, and agriculture industries are contributors to emissions. Biomass burning as part of slash-and-burn practices is performed during sugar cane harvesting which is a large source of reduced nitrogen and of gases and aerosols containing oxidized nitrogen.<sup>15</sup> During the winter there is less precipitation than the summer, resulting in more biomass burning during the winter. In rural areas of the state, sugar mills are common.

The city of Ribeirão Preto shown in Figure 1 is a municipality located in the northeast region of the state ( $21^{\circ}09'58.64 \text{ S}$ ,  $47^{\circ}50'42.960 \text{ W}$ ). The central, northern, and western regions of the state's economy is based on agro-industries: sugar/alcohol, orange, livestock and meat packaging. The southern regions of the state rely more heavily on metallurgical and food industries and agriculture industry (i.e. tea and banana) for its region's economy. Because of its location, the city of Ribeirão Preto economy is based primarily on agro-industries. The distance from the city to the South Atlantic Ocean is about 338 kilometers and hosts an estimated 700,000 citizens. Furthermore, its position geographically puts Ribeirão Preto free from influence by the Atlantic – as indicated by air mass projections being almost entirely landlocked, with few

samples originating from the Atlantic Ocean. This city was chosen for sampling due to ongoing collaborations between the research group at Texas A&M University – Corpus Christi and the group at the University of São Paulo Ribeirão Preto.

In response to the global COVID-19 pandemic, partial lockdown was ordered by the São Paulo state government on March 24<sup>th</sup>, 2020,<sup>63</sup> which closed many public spaces like shopping malls, restaurants, fitness centers, elementary, middle and high schools, and universities. Supermarkets and drugstores continued operating with restrictions concerning person-to-person distance and public transportation continued with reduced hours. Since partial lockdown was first ordered, estimated social isolation varied from 54% (March 24<sup>th</sup>), achieving a minimum of 47% (April 9<sup>th</sup>) and a maximum of 59% (several dates), with an average of 54%.<sup>63</sup> It is important to highlight that while industrial activity was not ordered to lockdown, many industries saw reduced operation which in part is related to decreasing demand.<sup>61</sup> Publicly available mobility data from registered cell phone activity indicates that the average activity deviation in Ribeirão Preto of retail, transit, and workplace areas leaves baseline on March 14, 2020 reaching a seven-day average minimum of -54.8% on March 27<sup>th</sup> and then gradually increases for the rest of the year.<sup>64</sup> The seven-day average of this deviation first returns to baseline on December 17, 2020. In this study, sample groupings contrasting different levels of anthropogenic activity conditions use the publicly available mobility data to distinguish the sample cohorts. This data and details are provided in the Appendix. The sample groupings are divided into (1) reference, before March 14<sup>th</sup>, whereafter average activity deviation falls below baseline and doesn't return; (2) reduced activity, after March 14<sup>th</sup> to December 17<sup>th</sup> where seven-day average of activity deviation is below baseline; and (3) post return to baseline, after December 17, 2020 where seven-day average of activity first returns to baseline.

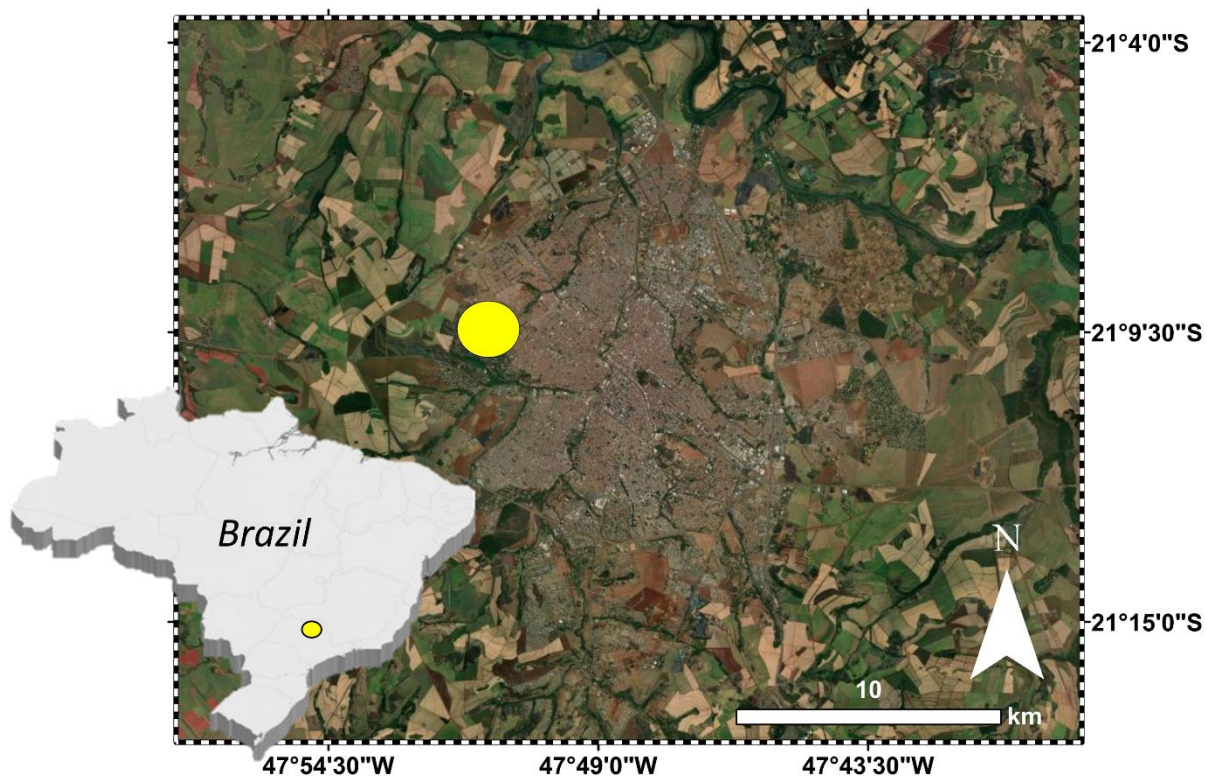


Figure 1. Location of the city of Ribeirão Preto, São Paulo, Brazil

## 2.2 Sample Collection

Rain samples ( $n = 32$ ) were collected using an automatic wet-only collector on an event-basis from 2/26/2020 through 5/2021 in Ribeirão Preto, São Paulo, Brazil ( $21^{\circ}09'58.64$  S,  $47^{\circ}50'42.960$  W). Samples were collected in previously cleaned high density polyethylene bottles and were retrieved from the field immediately after the event or during the following morning (when the rain event occurred at night). New sets of clean sampler funnels and flasks were installed after each rain event. Further description can be found in Coelho et. al. 2011.<sup>65</sup> After collection, each sample was filtered with a  $0.2\ \mu\text{m}$  quartz fiber filter to isolate DOM from

PM. Samples were then stored at 0°C until analysis to preserve the chemical composition of rainwater samples. Samples were shipped from USP-RP to TAMU-CC in coolers containing freezer packs.

### 2.3 Back trajectory

The NOAA's Hybrid Single-Particle Lagrangian Integrated Trajectory (HYSPLIT) online transport model was used to examine the air mass back trajectory from the São Paulo sampling location. Backward trajectories were run starting at altitudes 200 m, 500 m, and 700 m with a duration of 48 hours prior to sample collection at 21°09'58.64 S, 47°50'42.96 W. These parameters default parameters were used for mixing layer heights and estimated releasing height for this region based on parameters used by prior studies on rainwater DOM.<sup>66</sup> Model Vertical Velocity was used for the vertical motion calculation method.

### 2.4 Ultrahigh-Resolution Mass Spectrometer (UHRMS) analysis

Sample analysis was performed with an UHRMS (Orbitrap Fusion Tribrid Mass Spectrometer (OT-FT-MS); Thermo Fisher Scientific, Waltham, Massachusetts, USA) coupled to a UPLC system (Vanquish Ultra Pressure Liquid Chromatography). Analytes were separated using a 1.7  $\mu\text{m}$  ACQUITY UPLC BEH C<sub>18</sub> reversed-phase column by Waters (130Å, 1.7  $\mu\text{m}$ , 2.1 mm  $\times$  150 mm) with mobile phases consisting of a linear gradient of acetonitrile:formic acid and Milli-Q water:formic acid. The gradient started at 5% formic acid for 2 min (including a 7-min prerun equilibrium), increasing to 65% formic acid over 20 min, holding at 65% acetonitrile for 1 min, and then increasing to 100% formic acid over 3 min. The spray voltage of the ESI source was +3.2 kV, to produce ions in positive mode. The injection volume of each sample was 20  $\mu\text{L}$  and blank samples were also analyzed for background subtraction.

## 2.5 Inorganic Ion and DON/DOC Quantitation

Inorganic ions along with DOC and dissolved organic nitrogen (DON) were quantitated using the same method described in Crispim et. al. 2018. Inorganic nitrogen species ( $\text{NO}_3^-$ ,  $\text{NO}_2^-$ , and  $\text{NH}_4^+$ ) were analyzed using suppressed ion chromatography with conductivity detection (Model 881 Compact IC pro; Metrohm, Brazil). The anion analysis employed a Metrosep A Supp 5 column (Metrohm) and an eluent composed of sodium carbonate ( $3.2 \text{ mmol L}^{-1}$ ) and sodium bicarbonate ( $1.1 \text{ mmol L}^{-1}$ ). A solution of sulfuric acid ( $100 \text{ mmol L}^{-1}$ ) was used as the regenerant for chemical suppression. The cation analysis was performed using a Metrosep C4 column ( $150 \times 4.0 \text{ mm}$ , Metrohm) and an eluent composed of nitric acid ( $1.7 \text{ mmol L}^{-1}$ ) and dipicolinic acid ( $0.7 \text{ mmol L}^{-1}$ ). Ion chromatography standard solutions were used to construct the analytical curves. The limits of detection (LODs) were estimated visually by decreasing the concentration of each standard until the signal reached a value approximately 3 times higher than the noise.<sup>67,68</sup>

## 2.6 Data Processing

The obtained LC-MS spectrums were processed with Compound Discoverer software (version: 3.2.0.421). Molecular formula assignments were made using Molecular Formula Calculator (v.1.2.3) and an in-house python code. It should be noted that the compositional elemental of these formulas was constrained as  $\text{C}_{5 \sim 100} \text{H}_{4 \sim 200} \text{O}_{0 \sim 50} \text{N}_{0 \sim 10} \text{S}_{0 \sim 3} \text{P}_{0 \sim 3}$  and that the allowed m/z tolerance was 2 ppm. Several indicators were adopted to illustrate the characters of OM subgroups including elemental ratios, double bond equivalent (DBE), Aromaticity index (AI), and Kendrick mass defect (KMD). Their specific calculation and utilization are as follows.

## 2.7 Van Krevelen Analysis

Van Krevelen (VK) analysis was used to show the H:C and O:C molar ratios for each sample formula to describe the general overall composition or organic mixture composition.<sup>69</sup> The area within the diagram further characterizes the atmospheric OM distinct classes.<sup>46</sup>

## 2.8 Homologous Series Analysis

To identify compounds of a homologous series that have different numbers of specific base units, Kendrick mass (KM) analysis was used.<sup>69</sup> To determine the Kendrick mass, the measured IUPAC mass is normalized to 14.000u instead of the IUPAC 14.01565. Subtracting the nominal mass from KM will produce the Kendrick mass defect (KMD).<sup>47</sup> When the KMD is plotted as a function of the nominal mass these series of oligomers fall on a horizontal line separated by 14 Da, differing chemically by a methylene unit. This makes identifying compounds of different classes visually simpler as they are displaced vertically.

## 2.9 Double Bond Equivalence

The double bond equivalence (DBE) was calculated in order to determine the characterized ions using the following formula (1). DBE = number of rings plus double bonds to carbon.<sup>47</sup> DBE cannot be a negative integer.<sup>45</sup>

$$DBE = c - \frac{1}{2}h + \frac{1}{2}(n + p) + 1 \quad (1)$$

Where elemental composition is  $C_cH_hO_oN_nP_pS_s$

## 2.10 Aromaticity index

Aromaticity index (AI), based on Koch and Dittmar 2006, was assigned to each molecular formula. The following formula (2) will be classified as AI<0.5 non-aromatic, AI>0.5 aromatic and AI≥0.67 condensed aromatic.<sup>47</sup>

$$AI = \frac{DBE_{AI}}{C_{AI}} = \frac{1 + \frac{1}{2}(2c - h - 2o - 2s)}{c - o - n - s - p} \quad (2)$$

## 2.11 Volcano Plot

To identify statistically relevant changes in the rainwater DOM dataset, volcano plots were created by plotting significance against fold-change (FC) on the y and x axes respectively. These plots are common in omic experiments such as genomics, proteomics, and metabolomics where the most meaningful changes need to be identified from a set of thousands of replicate data points between two conditions.<sup>70</sup> The x axis is the log of the FC between the two conditions while significance ( $-\log_{10}$  of p-value from an ANOVA or t-test) is on the y-axis. For all plots, p-value was set to 0.05 and FC was set to 1. The log of the FC is used so that changes in both directions appear equidistant from the center. Plotting points in this way results in two regions of interest in the plot: the top of the plot far to either the left or right side. These points represent values that display large magnitude FC (being far to the left or right) as well as high statistical significance (being towards the top). Compounds with significant p-values and FC meeting the upper or lower FC threshold are specific to that group of samples or can be said to be characteristic of that sample group. It follows that these statistically distinct compounds can be isolated to explore how sample groups differ based on compound class and structure. The volcano plots produced were created using Compound Discoverer software (version: 3.2.0.421).

## 2.12 Principal Component Analysis

Principal component analysis (PCA) was used to characterize both the ion species and organics measured in the rainwater. A full description of this statistical technique can be found in Jolliffe (2002).<sup>71</sup> Ion PCA was performed using Matlab software (version R2020b) while organic matter PCA was performed using Compound Discoverer software (version: 3.2.0.421). Formulas present in only one sample and formulas present in all samples were removed to avoid biasing the PCA toward rare formulas and to eliminate formulas that do not contribute to the sample variance.<sup>44</sup>

## 2.13 Positive Matrix Factorization

Positive Matrix Factorization (PMF) analysis was performed on the ion concentrations data using the EPA PMF 5.0 model.<sup>72</sup> PMF was used as a multivariate factor analysis tool to identify source apportionment of species and can be briefly described by its foundational equation (3):

$$X_{ij} = \sum_{k=1}^p g_{ik} f_{kj} + e_{ij} \quad (3)$$

where  $X_{ij}$  is a data matrix of  $i$  by  $j$  dimensions,  $p$  is the number of factors,  $g_{ik}$  is the contribution of the  $k^{\text{th}}$  factor to the  $i^{\text{th}}$  sample,  $f_{kj}$  is the fraction of the  $k^{\text{th}}$  factor arising from congener  $j$  and  $e_{ij}$  is the residual for each sample/species. Samples with missing values were excluded from the data matrix before PMF was performed. The model was run 20 times for all eligible samples with a random seed of 80 and then run 20 times again excluding outliers with a random seed of 23. The five factor models were chosen for analysis after comparison with three, four, and six factor models on the basis of residual size, mapping bootstrap factors to base factors, and species regression accuracy. The details of the model can be found in the EPA PMF 5.0 user manual and

associated materials.<sup>72</sup> The calculation of data uncertainties is illustrated in the supplementary materials.

## CHAPTER III. RESULTS AND DISCUSSION

### 3.1 Organic Characterization

This analysis assigned 41,383 total mass features in 32 samples with 2,788 of these molecular formulas being unique. This is specifically an underestimate of the actual number of compounds because for each elemental composition there are multiple structural isomers possible, with the number of isomers increasing as molecular weight increases. In addition, the single ionization mode means species that do not readily ionize in positive ESI are not detected; this may include species such as, for example, nitrooxy- or nitrooxy-organosulfates. The omission of a preconcentration step may also put DOM constituents in particularly trace concentrations below detection limits. This does however prevent the loss of particularly volatile components or components lost during extraction; it is known that methods such as SPE contribute to analyte loss for higher oxygen content and more polar species up to 70% loss by mass.<sup>48-50</sup>

Table 1 provides a breakdown of the number of molecular formulas and their atomic characteristics per species subclass and its percent abundance relative to the total number of unique formulas in all samples. The most prominent species are CHON and CHONP, together making up 53.8% of unique formulas identified followed by CHONS with 17.6%. The other N containing species CHN, CHNS, and CHONSP then represent 14.6% of the total unique formulas. The remaining 14.0% are CHO, CHOP, CHOS species with a few CHS and CH formulas. No CHOPS species were identified within detection limits in any sample. Overall, species containing a nitrogen atom represent 86.0% of the organic species identified in this study. These findings differ from studies on total atmospheric organics in aerosol content, which show 36.6% atomic content for nitrogen containing species in mixed source aerosols and, at

highest, only 53.3% for biomass burning aerosols.<sup>44</sup> This prominence of N containing species is in part due to ion source bias, since this study used only positive ion mode in its MS analysis. This does corroborate with other UHRMS studies using positive ion mode to focus on characterizing rainwater DON which report nearly 2455 N containing formulas as compared to the 2397 presented here.<sup>45</sup> However, this does still suggest that true rainwater DOM character content is strongly influenced if not dominated by DON. Other rainwater DOM UHRMS studies using negative ion mode have reported only a total of 552 unique molecular species,<sup>2</sup> of which at least 15% are N containing formulas. To add the identified species from such a negative ion mode study to this would still imply the majority of characterized DOM are N containing (~74%, or ~71% assuming all N containing formulas are duplicates). This of course makes many specious assumptions, such as that (1) duplicate formulas do not exist, (2) the union of both ion modes represents characterization for all DOM constituents, (3) extraction loss is minimal and unbiased in all studies, and (4) the datasets are congruent. Regardless, it is possible that the large portion of N containing species seen here are species typically lost during extraction and preconcentration. This method of looking at chemical species highlights the variety of compounds present, rather than the total mass or amount, so while other species may be more abundant, N containing species present the highest variety of unique compounds in this analysis. In this method, variety will tend to influence how chemical character is judged more than abundance. To illustrate, by concentration the samples in this study show DON/DOC ratios that range from 0.1% to 16.9%, averaging 5.8%, while the total N:C ratio of all unique formulas assigned is 20%.

|        | n Formulas | Atomic Content (%) | H/C             | O/C             | O/N             | O/S             | N/C             | DBE             |
|--------|------------|--------------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| CHN    | 262        | 9.40               | $1.70 \pm 0.52$ | 0.00            | 0.00            | -               | $0.14 \pm 0.13$ | $2.82 \pm 2.55$ |
| CHNS   | 94         | 3.37               | $1.72 \pm 0.51$ | 0.00            | 0.00            | 0.00            | $0.18 \pm 0.07$ | $4.44 \pm 2.67$ |
| CHO    | 173        | 6.21               | $1.38 \pm 0.64$ | $0.30 \pm 0.11$ | -               | -               | 0.00            | $4.49 \pm 3.35$ |
| CHON   | 716        | 25.68              | $2.00 \pm 0.28$ | $0.19 \pm 0.11$ | $1.73 \pm 1.8$  | -               | $0.19 \pm 0.14$ | $2.23 \pm 1.95$ |
| CHONP  | 784        | 28.12              | $2.42 \pm 0.14$ | $0.23 \pm 0.10$ | $0.74 \pm 0.30$ | -               | $0.32 \pm 0.05$ | $0.04 \pm 1.49$ |
| CHONS  | 490        | 17.58              | $2.11 \pm 0.20$ | $0.24 \pm 0.22$ | $1.53 \pm 2.75$ | $2.98 \pm 2.79$ | $0.23 \pm 0.11$ | $2.14 \pm 1.80$ |
| CHONSP | 51         | 1.83               | $2.16 \pm 0.18$ | $0.70 \pm 0.33$ | $6.30 \pm 5.57$ | $8.75 \pm 4.54$ | $0.20 \pm 0.12$ | $1.85 \pm 1.38$ |
| CHOP   | 34         | 1.22               | $2.21 \pm 0.09$ | $0.39 \pm 0.03$ | -               | -               | 0.00            | $0.38 \pm 0.69$ |
| CHOS   | 176        | 6.31               | $1.87 \pm 0.11$ | $0.65 \pm 0.11$ | -               | $5.68 \pm 2.34$ | 0.00            | $1.90 \pm 1.10$ |
| CHS    | 5          | 0.18               | $1.38 \pm 0.02$ | 0.00            | -               | 0.00            | 0.00            | $6.70 \pm 0.45$ |
| CH     | 3          | 0.11               | $1.59 \pm 0.10$ | 0.00            | -               | -               | 0.00            | $2.50 \pm 0.00$ |
| All    | 2788       | 100.0              | $2.06 \pm 0.42$ | $0.23 \pm 0.2$  | $1.21 \pm 2.03$ | $3.56 \pm 3.40$ | $0.20 \pm 0.14$ | $1.82 \pm 2.38$ |

Table 1. Total unique formulas and atomic content of all species positively identified from all samples (n = 32).

However, there are various other potential explanations for what drives ON's disproportionately large influence on DOM chemical character. Such explanations could be that ON emissions are large relative to other organic emissions (i.e. N containing species are high input into this system, likely biomass burning related), ON emissions have more variety relative to other organic emissions (i.e. emissions of N containing species are diverse), that N containing species have higher water solubility than other organics (i.e. rainwater scours ON preferentially to other organics), or that atmospheric nitrogen chemistry—particularly that involving NO<sub>x</sub> and NH<sub>3</sub>—adds diversity to DOM (i.e. species have many pathways to chemically incorporate nitrogen into their structure once in atmosphere). The findings here concerning the water soluble organic nitrogen (WSON) fraction are generally consistent with other studies that demonstrate

the important role of ON as a ubiquitous and significant component of both rainwater and aerosol chemistry.<sup>45,73</sup> These findings may also suggest that other studies that miss this high N content may inaccurately infer certain properties about rainwater DOM, namely underestimating its potential bioavailability. Many studies have demonstrated the high bioavailability of rainwater DOM relative to other matrices, such as streams, rivers, and estuaries, and those that use molecular indicators for bioavailability, e.g. N:C ratio, very well may be underestimates.<sup>74–78</sup> Furthermore, the findings here may begin to explain the drivers of rainwater DOM's high bioavailability molecularly. Many general explanations are often attributed to inputs of labile DOM, namely fresh terrestrial plants,<sup>79,80</sup> marine phytoplankton,<sup>81</sup> and combustion sources,<sup>82</sup> but few consider photochemical transformations of organic compounds in atmosphere, particularly those involving atmospheric NO<sub>x</sub> and NH<sub>3</sub>.

The relative abundances of each class of formulas are not static over time. Figure 2 illustrates this by graphing the percent abundance of each formula class for each sample. The proportions of each class remain relatively stable over the whole sample set with no immediately recognizable trends. The largest variations are associated with the CHON and CHONP classes which can deviate as much as 20% with notable variations in CHO, CHN, and CHONS which can deviate as much as 8%, 9%, and 12% respectively. CHS only appears in samples n23 through n26, reaching only as high as 1.2% abundance. Backtrajectories for n23 through n26 do not show any marine influence nor any strong similarity in backtrajectory. Inorganic data indicates n23 and n24 have the same primary factor influence however no inorganic ion data is available for n25 and 26. In the organic PCA, these four samples are clustered in Q1 with the most positive PC 1 and PC 2 values. Within the groupings of anthropogenic activity (shown in the supplemental material Figure A2), no strong trends or deviations are observed between

groups. The largest deviation is associated with CHON with a maximum difference of 4.6% with the next highest of 2.6% for CHN. Simplifying down to only observing the percent of formulas containing N, containing S, or containing P does not indicate any apparent trends or differences between groupings. For all formulas, 86.0% contain N, 29.3% contain S, and 31.2% contain P with standard deviations among all samples of 2.5%, 3.3%, and 4.4% respectively. The maximum deviations for these metrics are 11.2%, 13.0%, and 20.6%. This shows that the largest variations are among P containing species, mostly driven by deviations in CHONP. Since CHON is the formula class with the largest maximum deviation while N containing species hold the lowest deviations overall, this indicates that changes in CHON abundance are compensated by changes in other N containing species. Simple Pearson correlations between percent containing N, containing S, and containing P show a slight negative correlation between %N containing and %S containing of  $r = -0.24$  ( $p = 0.19$ ) and a positive correlation between %S containing and %P containing of  $r = 0.33$  ( $p = 0.07$ ), with no significant correlation between %N containing and %P containing ( $r = 0.04$ ,  $p = 0.84$ ). This could suggest that N containing species and S containing species may have stronger differences in emission origins while S containing species and P containing species may be more related in origin. It could also imply that chemical exchange in the atmosphere is competitive among N containing species and S containing species. Concerning the anthropogenic activity groupings, the maximum deviations between the groupings are 0.9% for N containing, 2.0% for S containing, and 2.8% for P containing. With each of these being below the standard deviations, it appears there is no significant difference between the Reference, Reduced activity, and Post-baseline groups in regards to percent containing N, containing S, or containing P species.

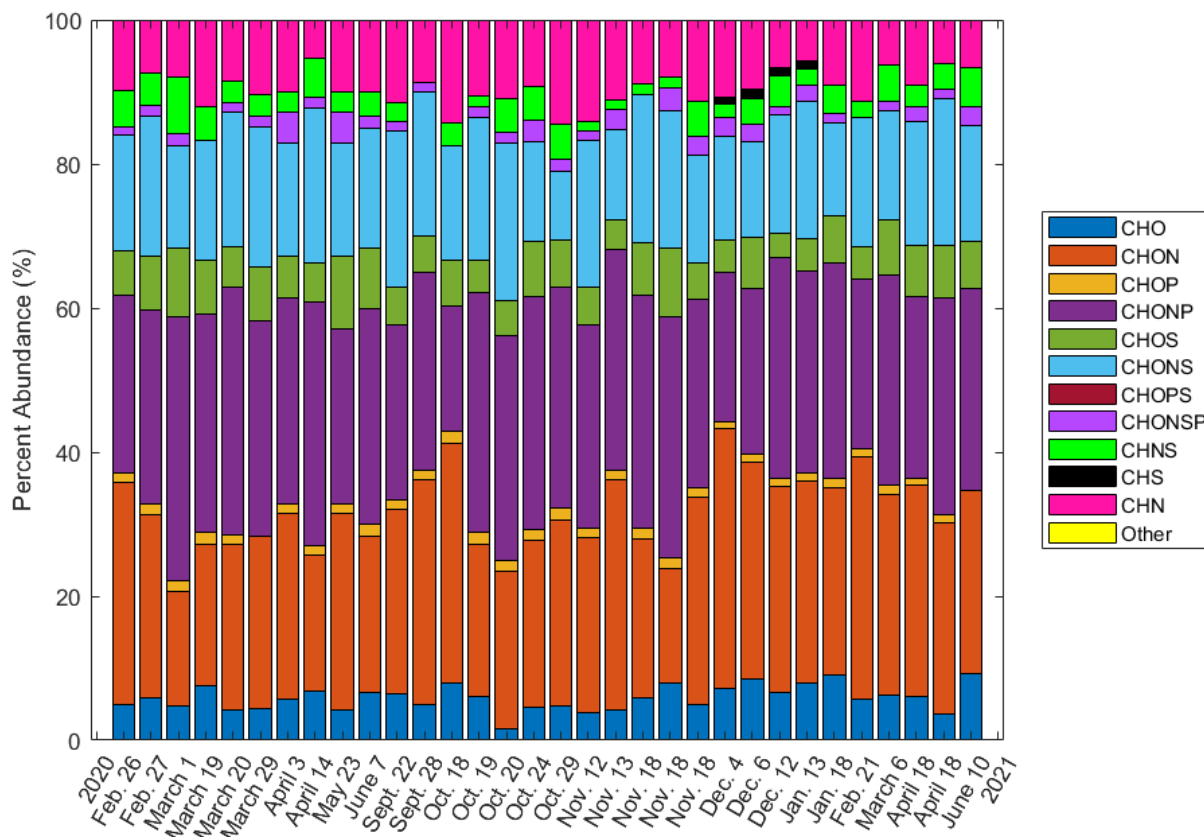


Figure 2. Percent abundance of formula class detected in each sample in order of collection.

Highlighted in the Van Krevelen diagram in Figure 3, the majority of identified compounds are in the O:C ratio range of 0 to 0.4, particularly among CHON, CHONP, CHO species. Sulfur containing species, such as CHONS, CHONPS, CHOPS, and CHOS inhabit a wider range of O:C ratios and are the primary species in higher oxidation ranges, likely related to the oxygen dense organosulfate functional group. Conversely, the H:C ratio range of the CHO species is much wider than the other organic species, sitting between 0.5 and 2.5. Of the N containing species, CHN and CHS species have the lowest H:C ratio ( $1.71 \pm 0.52$  and  $1.72 \pm 0.51$  respectively) while out of all oxygen containing classes CHON, CHONP, and CHONS have

the lowest O:C ratios (Table 1). While CHONP is localized rather tightly in the 2 to 2.5 range of H:C ratios with an average of  $2.42 \pm 0.14$  (Table 1), indicating mostly phospholipids, CHON compounds range between 1.3 and 2.4 with an average of  $2.00 \pm 0.28$  strongly indicating a variety of BVOCs, amino acids, and peptides. Amino acids are a commonly measured component of WSON as they are highly reactive, easily oxidized in the atmosphere, and can have a catalytic role in condensation reactions.<sup>83</sup> Indeed, the presence of valine, glycine, glutamine, glutamate, phenylalanine, and proline were directly confirmed with fragment ion spectral matching, along with serine, leucine, glycine, glutamine, glutamate, and phenylalanine derivatives. While the direct contribution of amino acids typically range from only 2-25% of total WSON,<sup>84,85</sup> their true contribution to total WSON is likely higher as the presence of certain amino acid derivatives are already confirmed, CHON class compounds are the dominate fraction of WSON, and there are regular patterns in CHON mass difference (seen in the Kendrick analysis in Figure 8) indicating the presence of reaction product oligomers. This is congruent with other studies that suggest amino acids contribute more to total WSON than just the free amino acid content.<sup>45,84</sup>

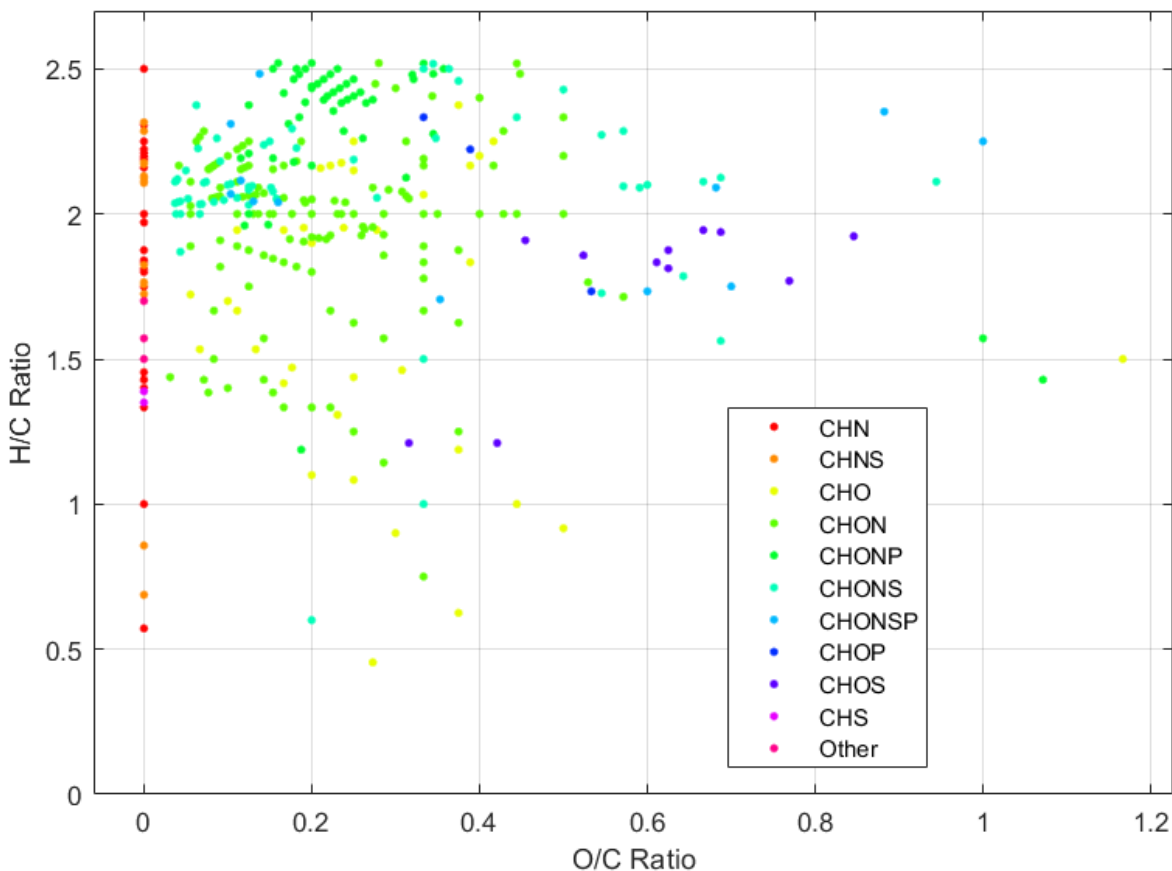


Figure 3. Van Krevelen Diagram of all unique organic species positively identified from all samples. (n = 32).

The presence of aliphatic S containing species, that is CHOS and CHONS with O:C ratios between 0.3 and 1.2 and H:C ratios between 1.3 and 2.0, are indicative of oxidized anthropogenic urban/vehicular emissions.<sup>44</sup> However, other species also indicative of oxidized anthropogenic urban/vehicular emissions such as CHO and CHON formulas with O:C ratios between 0.35 and 0.85 are not present. This could indicate that either these species are not present in the airshed or that more oxidized CHO and CHON compounds have reduced solubility in water, thus not appearing in the WSOC fraction. That however is contrary to other work that has shown that secondary formation via aqueous reactions in the anthropogenic environment with higher  $\text{NO}_x$  concentrations produce water soluble carbonyls with high O:C ratios.<sup>86</sup> It is

more likely that these oxidized species are simply not ionized in positive mode ESI, and therefore not detected.

None of the S containing free amino acids methionine, cysteine, homocysteine, or taurine were detected in these samples. However, CHONS compounds dominate the S containing compound classes (which are 29.3% of all formulas), representing 60% of all S containing formulas. This lends itself to the strong possibility that S containing amino acids derivatives are still strong contributors to the organic S content. Free methionine has been detected in marine rainwater studies and likely undergoes secondary reactions to alter the C, O, and N content of the molecule.<sup>45</sup> These reactions retain the thioether bond leading to a variety of CHONS compounds analogous to other known amino acid reactions. The failure to detect S containing free amino acids here doesn't necessarily indicate that S containing amino acids do not contribute to the organic S content, but that they may only contribute through peptides or secondary products of the free amino acids. The CHOS and CHONSP classes have the highest O:C ratio of all compound classes ( $0.65 \pm 0.11$  and  $0.70 \pm 0.33$  respectively) while all P containing classes have O:C ratios higher than the total average O:C ratio. These higher O:C ratios indicate it's more likely that the majority of CHOS and P containing species are derived from secondary reactions involving inorganic S and P rather than from primary emission of organic S and organic P.<sup>87</sup>

On the whole, with an average H:C ratio of  $2.06 \pm 0.42$  and O:C ratio of  $0.23 \pm 0.20$ , this study shows DOM that is more hydrogenated, less oxidized than bulk aerosol OM studies<sup>44</sup> and marine related rainwater DON studies also using positive mode ESI.<sup>45</sup> Comparing atomic ratio per sample, shown in Figure 4, indicates that both Reference and Post-baseline samples occupy a narrow range of H:C and O:C ratios, while Reduced activity sample have a much broader range of H:C and O:C ratios. This could indicate a strong reduction in the primary species that weight

the ratios in the Reference and Post-baseline groups. Alternately grouping the samples by season (in Figure 5), it can be seen that the dry season samples occupy slightly higher O:C ratios than the wet season samples, likely indicating the presence of more oxidized species in the dry season. This is congruent with higher proportions of biomass burning related compounds, which tend to be highly oxidized. Average atomic ratios for other heteroatoms do not show similar relationships for these same groupings (presented in Figures A4-A6).

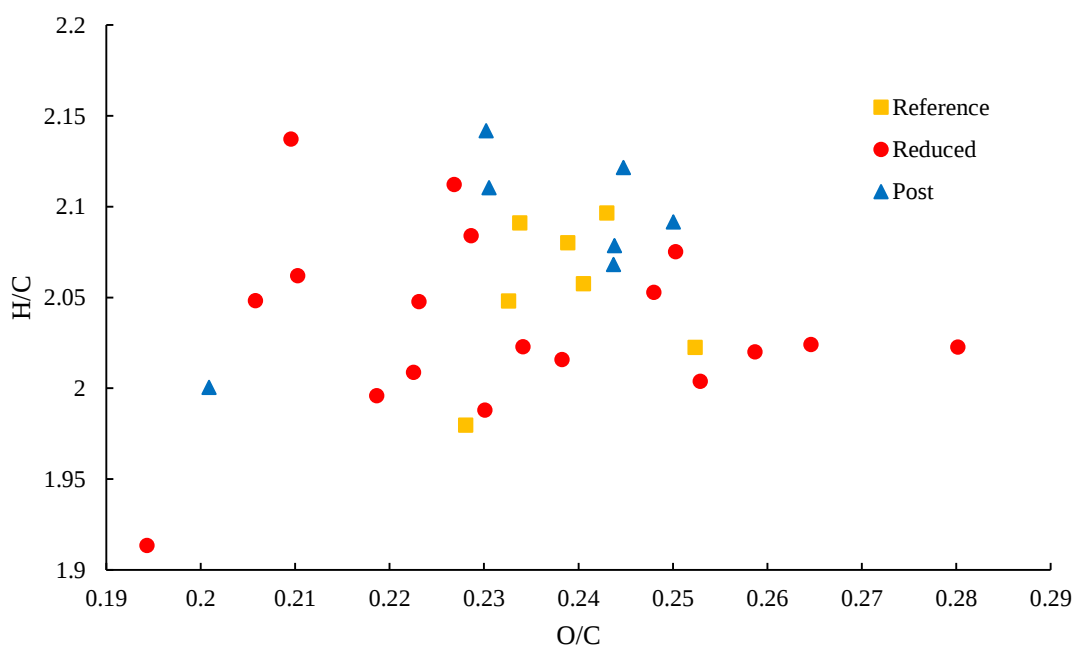


Figure 4. Van Krevelen Diagram of each sample's average atomic ratio labeled by activity group. (n = 32).

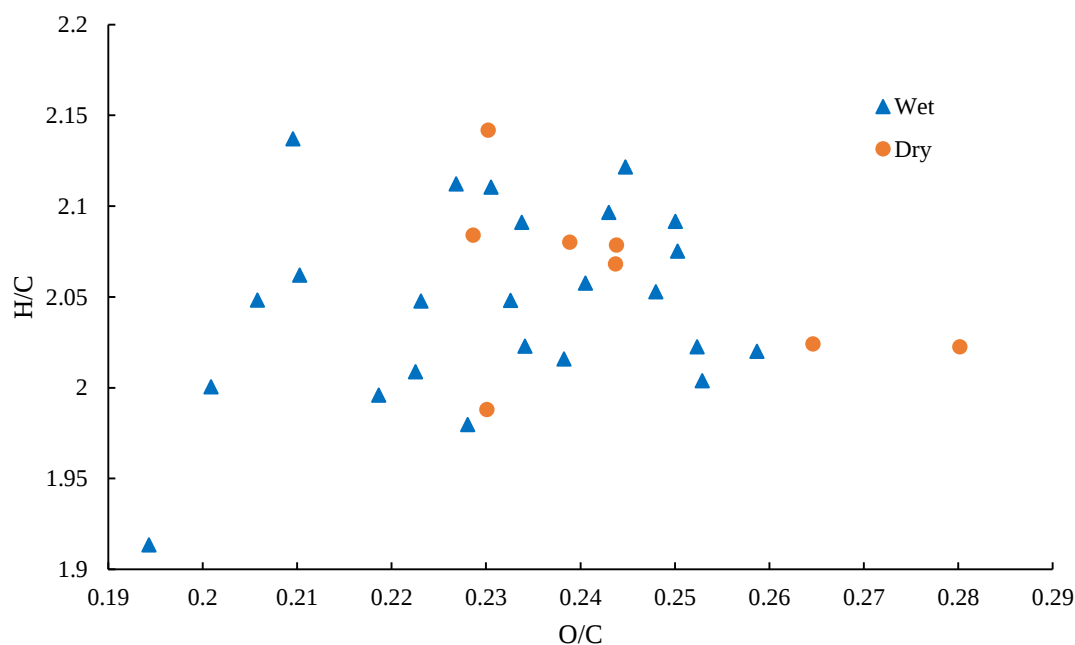


Figure 5. Van Krevelen Diagram of each sample's average atomic ratio labeled by season. (n = 32).

### 3.2 Organic PCA

PCA was utilized to describe the differences in the overall chemical character of the organic species present between samples. In the initial PCA, PC1 and PC2 described 19.6% and 11.8% of the variance, respectively. The PCA shown in Figure 6 manages to roughly distinguish samples from different levels of anthropogenic activity, placing six out of the seven Reference period samples in quadrant four (Q4), generally locating Reduced period samples around zero in PC 2 in a wide range of PC 1 values, and clustering Post-baseline samples with positive PC 2 values and PC 1 values near the Q1 and Q2 boundary, leaning towards Q1. This grouping contrasts samples at different levels of anthropogenic activity to demonstrate a change in DOM chemical character as a response to pandemic related trends in anthropogenic activity. Looking at the samples ordinally, the Reference period samples tend to be more negative in PC 2 and positive in PC 1 moving from Q4 to Q3 and Q2 as their PC 1 values decrease and their PC 2

values increase. These samples, n20 to n29, cover February to May 2020. However, the samples in the Reduced period with PC 2 values closest to zero also have a wider range of PC 1 values than samples with more extreme PC 2 scores. These samples encompass the range of n30 to n41, collected between June to November 2020. The Post-baseline samples tend to be the highest PC 2 valued samples with generally positive PC 1 scores. These samples, n42 to n51, go from December 2020 to June 2021.

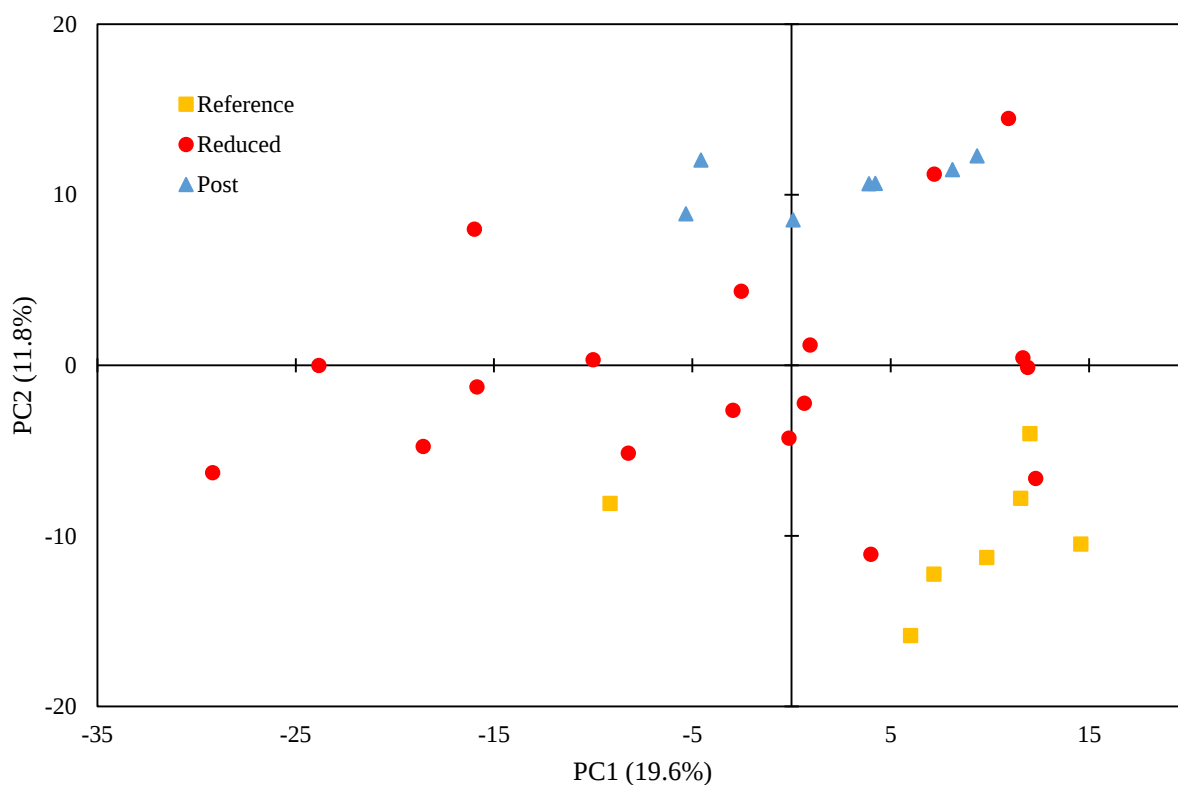


Figure 6. Organic Character PCA plot of all samples, labeled by activity deviation group.

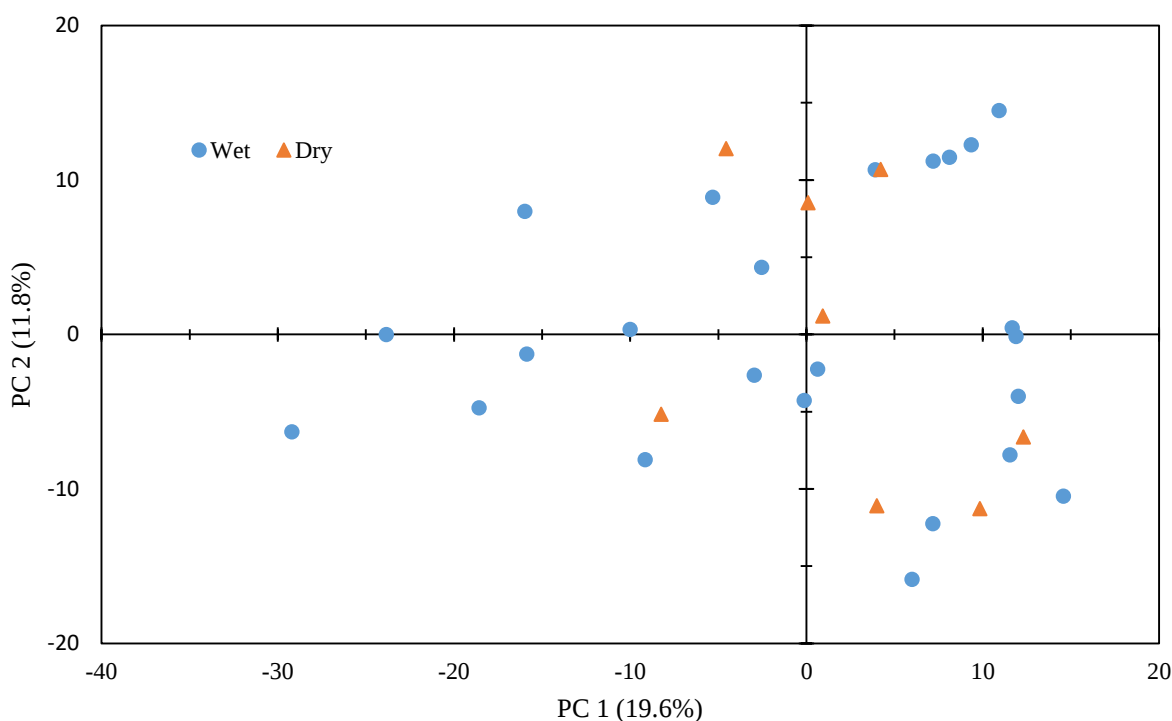


Figure 7. Organic Character PCA plot of all samples, labeled by if the sample was collected in either the wet season (orange) or the dry season (blue).

Comparing the activity deviation grouping in Figure 6 to Figure 7, grouped by wet or dry season, it can be seen that the two seasons cannot be significantly distinguished from each other, indicating that Figure 6's clustering is likely not seasonally derived or at least not primarily, as the inorganic ion PCAs could be. Performing this same analysis for air mass back trajectory using HYSPLIT (Figure A3), provides a similar result with no particular relationship arising from spatial distribution. As long range backtrajectory is not a primary driver of clustering, this suggests that long range transport is not a large influence relative to local emissions, as also suggested by other studies in this region.<sup>65,88</sup> Isotopic studies also illustrate that local emissions tend to be influential in determining rainwater DOC, with residence time on the order of days.<sup>66</sup>

In order to probe what species drive the differences in chemical character, identifying the species that weigh in the PCA loadings plot is a viable option. However, a statistically more

rigorous method is found in volcano plotting, discussed further on. Alternately, looking at how specific classes or related compounds are represented in the PCA loadings plot may reveal their relevance to overall organic character. The Kendrick analysis in Figure 8 identifies a series of related oligomers which when highlighted in the PCA loadings plot in Figure 7, all weight positively in PC 1 and evenly balanced in PC 2. This indicates that samples placed in Q1 or Q4 of the organic character PCA likely contain some or all of these oligomers. These samples, largely the Reference group and samples nearing the December Post-baseline crossing, could represent a higher level of nitrogen input, likely related to agricultural or anthropogenic sources. The oligomers of interest were all assigned a CHON formula with a mass tolerance < 1ppm, which supports the notion that these are related SOA compounds. It is known that heterogeneous multiphase chemical transformations are a pathway for anthropogenic related alkaloids to undergo oligomerization and incorporation into the WSOC fraction of SOA.<sup>55,86,89-91</sup> However, further study and structural analysis is needed to make more definitive assertions towards the origins and possible secondary processing of these specific oligomers.

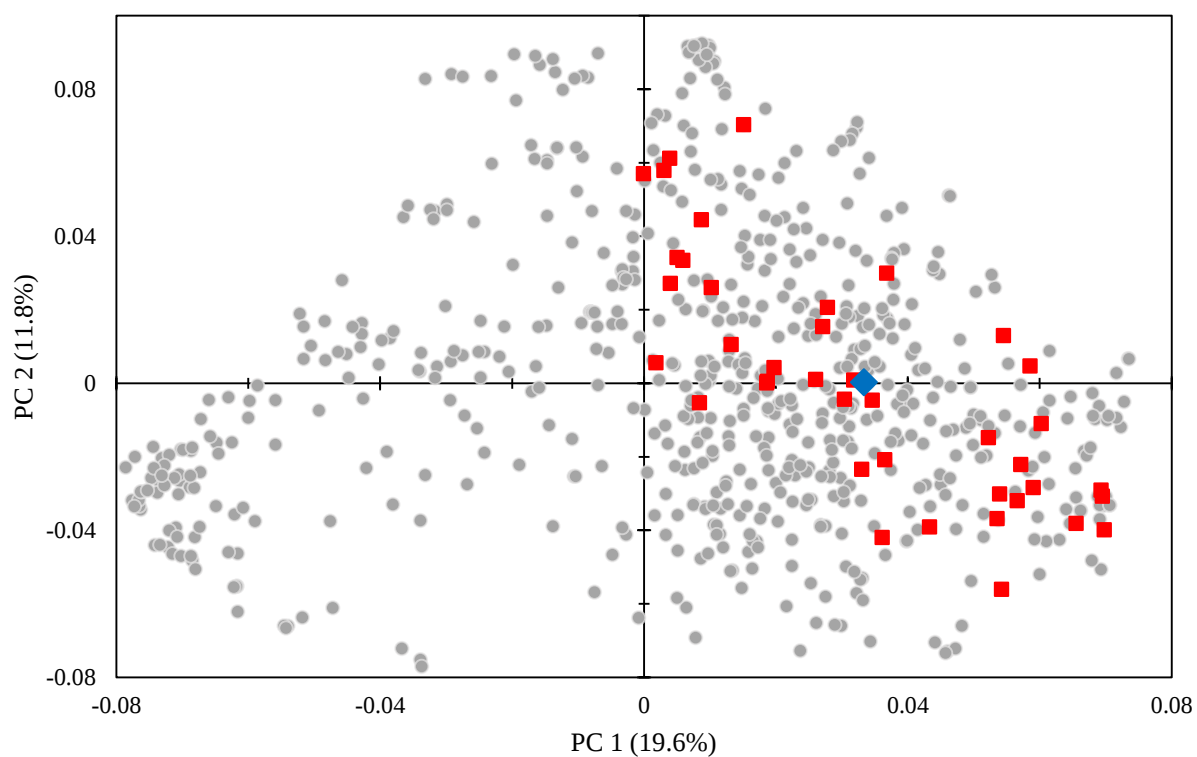


Figure 8. Organic Character PCA loading plot of all species used to calculate each sample's PCA score in Figure 6. Highlighted in red squares are related oligomers also highlighted in the following Kendrick plot. The blue diamond is their average weighting.

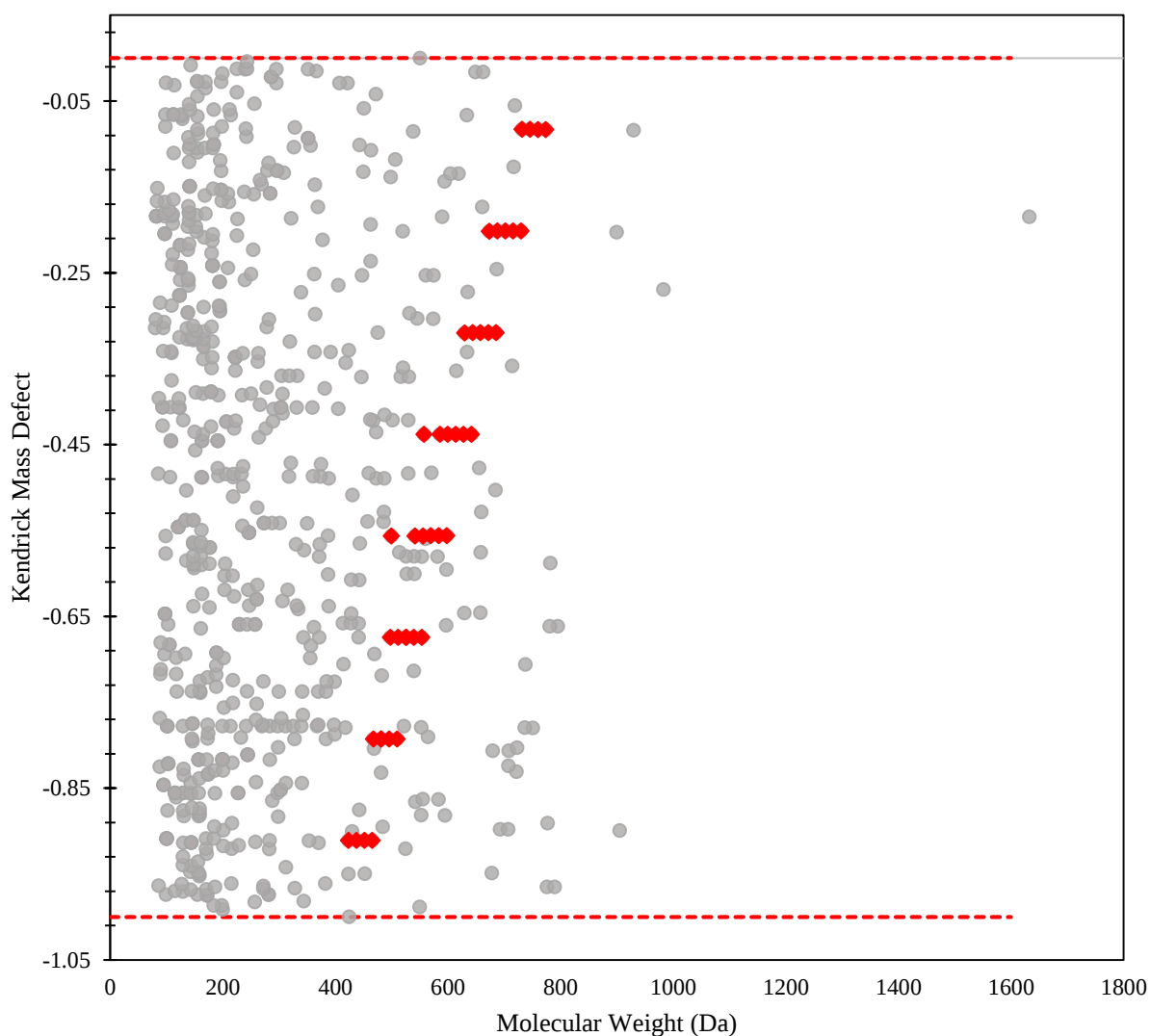


Figure 9. Kendrick mass defect plot all organic species positively identified. Highlighted in red are related oligomers also highlighted in the previous PCA loadings plot in Figure 7.

### 3.3 Volcano Plot

Volcano plots were used to identify statistically relevant changes in the rainwater DOM dataset between different groupings of samples. The first pairing in Figure 10, contrasting Reference and Reduced activity samples, found 57 up-regulated compounds (i.e. significant to Reference period samples) and 127 down-regulated compounds (i.e. significant to Reduced activity samples), presented in full in Tables A1 and A2. The up-regulated species are

compounds such as choline, linoleamide, chloropicrin, and what appear to be mostly CHON and CHONP compounds whose structures could not be resolved. Many of these compounds appear to be biosynthetic related,<sup>92,93</sup> however many can be agriculture or industrially related, particularly noted by the presence of chlorinated species confirmed with fragment ion analysis. The down-regulated compounds appear to be a variety of molecules, particularly BVOCs, some of which contain aromatic rings, others are amino acids such as phenylalanine, serine, norvaline, or amino acid derived like tyramine or biosynthetic such as the carnitine derivatives and many that cannot be structurally resolved. Altogether they do not point to a specific emissions relationship, though individually they are likely biosynthetic or biomass burning related. The significance of direct amino acid contribution to the Reduced period samples may be a strong indicator of the increased proportion of primary species in these samples. This suggests that either these samples were influenced more directly by primary emissions or overall atmospheric secondary processing decreased with decreasing anthropogenic activity. Other research has begun to demonstrate that the atmospheric oxidation capacity and the formation potential of SOA increases with increasing air pollution,<sup>94,95</sup> however both the Rio de Janeiro and São Paulo regions both saw an increase in ozone concentration of nearly 30% during the Reduced period due to NO<sub>x</sub> reduction in VOC controlled ozone conditions.<sup>61,96</sup> Typically an increase in ozone would also suggest an increase in secondary processing of VOCs due to its strong oxidative potential, however that would neglect the changes in the overall oxidation capacity of the airshed, which these results would suggest decreased during the Reduced period.

Combustion related emissions, likely biomass burning are likely the sources for the aromatic and condensed species identified here such as thioquinox, phenethylamine, and pyridoxal. Although traditionally defined to be water insoluble, it has been shown that many

combustion derived aromatic and condensed compounds that fit the definition of black carbon (BC) do appear in the WSOM fraction of atmospheric organics<sup>44</sup> and aquatic DOM.<sup>97</sup> Indeed, BC is recognized to exist on a spectrum of solubility and recent studies have demonstrated that the oxidation of BC can increase its solubility,<sup>98,99</sup> supporting the idea that secondary processing may enhance the incorporation of combustion products into the WSOC fraction of OA. These aromatic and condensed aromatic compounds have higher potential for absorbing light than more saturated molecules,<sup>7</sup> highlighting their importance in climate systems.

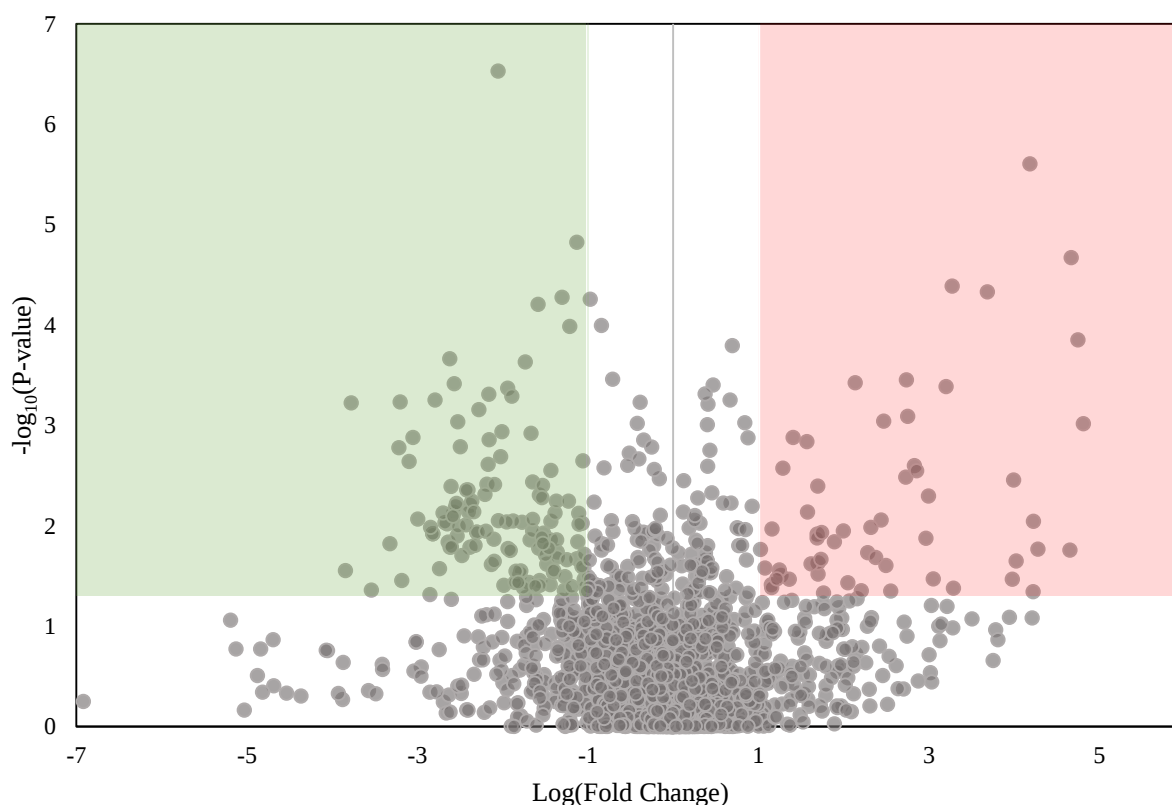


Figure 10. Volcano plot of Reference group samples against Reduced activity group samples. Up-regulated compounds are located in the red region (Reference group significant compounds) while down-regulated compounds are located in the green region (Reduced group significant compounds).

The second pairing in Figure 11 contrasts Reference and Post-baseline activity samples. This analysis found 221 down-regulated compounds (i.e. significant to Post-baseline period samples) and 86 up-regulated compounds (i.e. significant to Reference period samples), presented in full in Tables A3 and A4. The up-regulated compounds are largely the same or similar to the up-regulated compounds in the prior volcano analysis contrasting the Reference and Reduced groups, with 45 out of the 57 compounds in the previously up-regulated—Reference significant compounds—being up-regulated compounds here. However, the additional up-regulated compounds here are more biosynthetic related and amino acid related such as leucine and carnitine. The down-regulated compounds here have a few overlapping species with the prior down-regulated compounds, namely thioquinox and phenethylamine, which are the aromatic containing species previously discussed to be more biomass burning related. This indicates that the Reduced and Post-baseline groups are likely similar in biomass burning influence, which is corroborated by their similarity in season. The Reference and Post-baseline groups differ most in season and not in their activity. To that effect, the most notable down-regulated compounds are carbamates, palmitates, and some glycerol and sorbitol related compounds. Carbamates are notably involved in photosynthetic CO<sub>2</sub> capture<sup>100</sup> while palmitates are natural biosynthetic products of a wide variety of tropical plants, particularly the *Pandanaceae* family and many domesticated crops such as *Vitis vinifera* (the common grape), *Aloe vera*, and, most importantly, palm oil.<sup>101,102</sup> The glycerol and sorbitol species are also likely photosynthetically related, being rather notable biomolecules. These particular compounds may be seasonal indicators of photosynthetic activity in this region and may prove useful as BVOC indicators in future work.

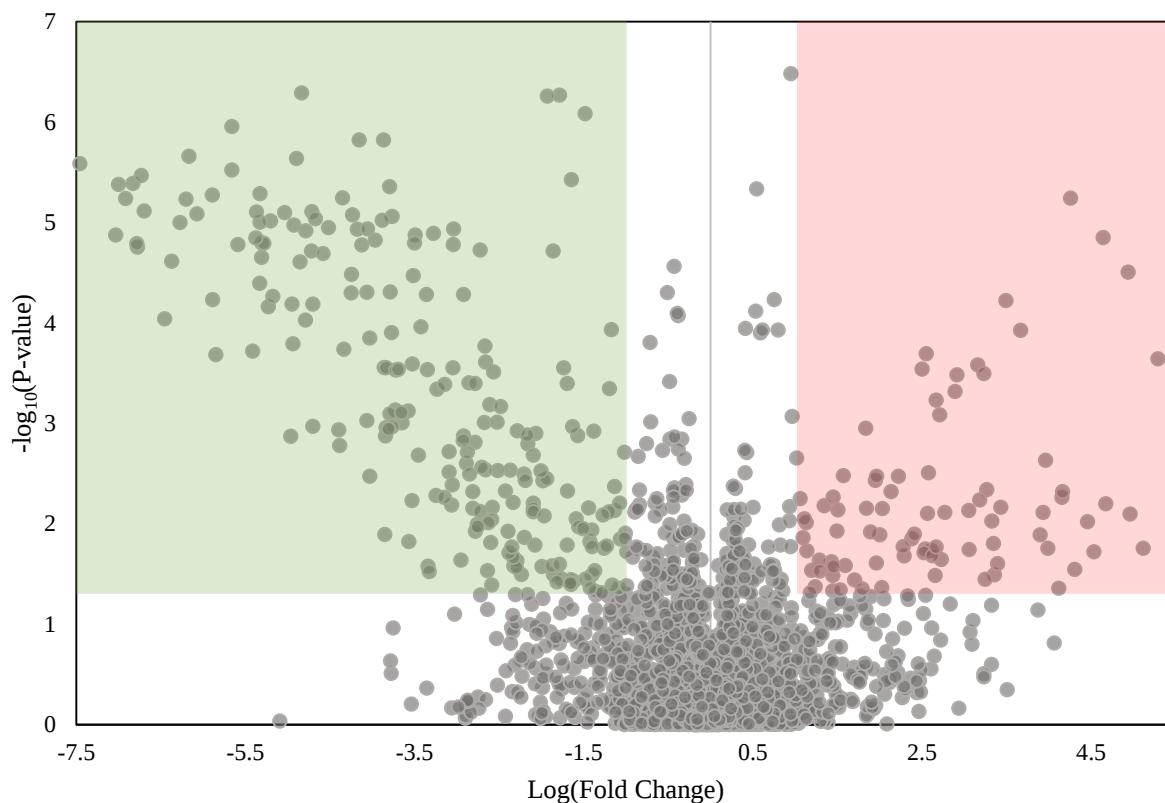


Figure 11. Volcano plot of Reference group samples against Post-baseline group samples. Up-regulated compounds are located in the red region (Reference group significant compounds) while down-regulated compounds are located in the green region (Post-baseline group significant compounds).

The last volcano plot analysis pairing contrasts Post-baseline and Reduced activity samples in Figure 12. This analysis found 24 down-regulated compounds (i.e. significant to Reduced period samples) and 135 up-regulated compounds (i.e. significant to Post-baseline period samples), presented in full in Tables A5 and A6. The up-regulated compounds have many overlapping species with the down-regulated compounds in the previous volcano analysis contrasting the Reference and Post-baseline samples, particularly the palmitates, sorbitol, and glycerol species. The carbamates notably are mostly missing, indicating that many of them likely appear both in the Reduced and Post-baseline samples. This may suggest the palmitates, sorbitol, and glycerol species may be more prevalent or only present during a specific seasonal transition

or timeframe that is not covered in the Reduced group while the carbamates are more ubiquitous. Most of the down-regulated species are strikingly simple biomolecules and amino acids, namely norleucine, leucine, l-threo-3-Phenylserine, norvaline, and carnitine derivatives. This again suggests that there is an increase in the proportion of primary species in the Reduced samples, likely indicating that overall atmospheric secondary processing for these primary species decreased with decreasing anthropogenic activity. It also indicates conversely that as anthropogenic activity came closer to returning to baseline, the proportion of these primary species decreased and their secondary processing increased. In this analysis, there is a higher variety and number of up-regulated compounds. This larger diversity could indicate a larger variety of emission sources, a higher input of specific sources that have a higher chemical diversity, or the enhancement of secondary processes, which often promotes chemical diversity.<sup>41</sup> However, basing this assertion solely on the number and variety of up or down-regulated species identified is a rather specious claim when considering the statistical basis of volcano plot analysis.

Volcano plots are traditionally used in proteomic, genomic, and metabolomics studies and this is one of its first applications in environmental systems. Volcano plotting selects significant and relevant compounds based on their p-value and fold change, and adjusting the tolerance for each of those parameters will drastically alter the number of selected compounds and not proportionally. This means that the number and variety of selected compounds may have more to do with the parameters of the analysis and less with true variety of species in the sample groups. For instance, raising the p-value threshold from 0.05 to 0.04 in the first volcano plot analysis in Figure 10 would eliminate 11% of the significant up-regulated compounds while only eliminating 4% of the significant down-regulated compounds. Adjusting further to 0.01 would

eliminate 60% and 51% of selected significant up and down-regulated compounds respectively. Indeed, even with consistent parameters volcano plots have come under scrutiny for a high type I error rate, leading to an inflation of false discoveries.<sup>103</sup> While remedies for these issues have begun to be applied and the technique itself is a strong statistical tool, it is important to remember that features identified through this analysis are not conclusive nor comprehensive but merely statistically strong indicators of relevant components. Further study and considerations are required to sufficiently begin adopting volcano plotting techniques for use outside of their traditional fields.

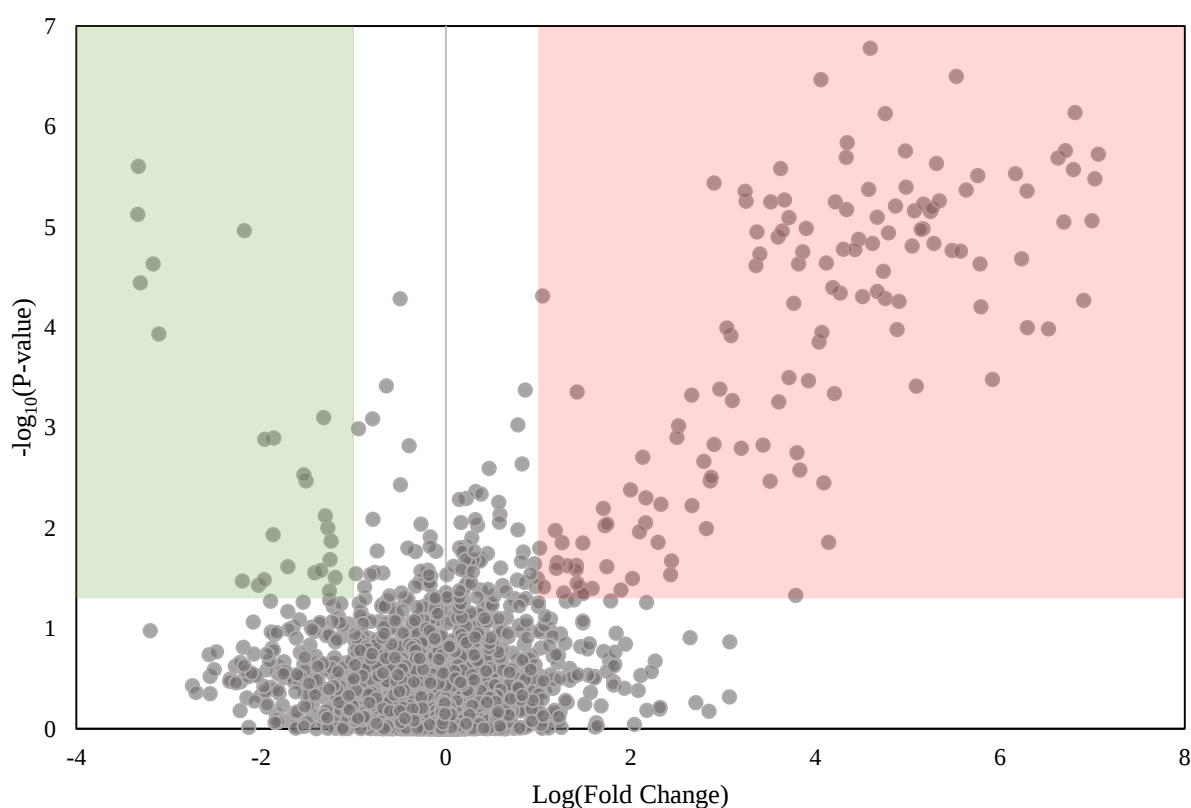


Figure 12. Volcano plot of Post-baseline group samples against Reduced activity group samples. Up-regulated compounds are located in the red region (Post-baseline group significant compounds) while down-regulated compounds are located in the green region (Reduced group significant compounds).

### 3.4 Inorganic Ion PCA

PCA was also utilized to describe the differences in the inorganic species present between samples. In the unaltered PCA, PC 1 represents 51.7% of the variance in the sample set, indicating it can explain about half of the variance in the ion concentrations, while PC 2 and 3 only explain 19.1% and 12.2% respectively. The PCA as presented in Figure 13 strongly identifies three outlier samples, n3, n11, n12 in the ion PCA that lie outside the main cluster around the origin, each with at least one PCA score that is greater than three standard deviations from the mean. These outlying samples score positive along PC 1, indicating that they are influenced by species that weight positively in the component factors for PC 1, such as  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$  as seen in the component factor loadings in Figure 15. The component loadings show that PC 1 weights reactive nitrogen species positively as well as  $\text{PO}_4^{2-}$  and DOC, suggesting high PC 1 scores indicate those samples are likely agriculturally influenced. For organic acids, PC 1 favors acetate, glycolate, and oxalate over formate, possibly indicating that higher scored PC 1 samples may represent less oxidative processing.

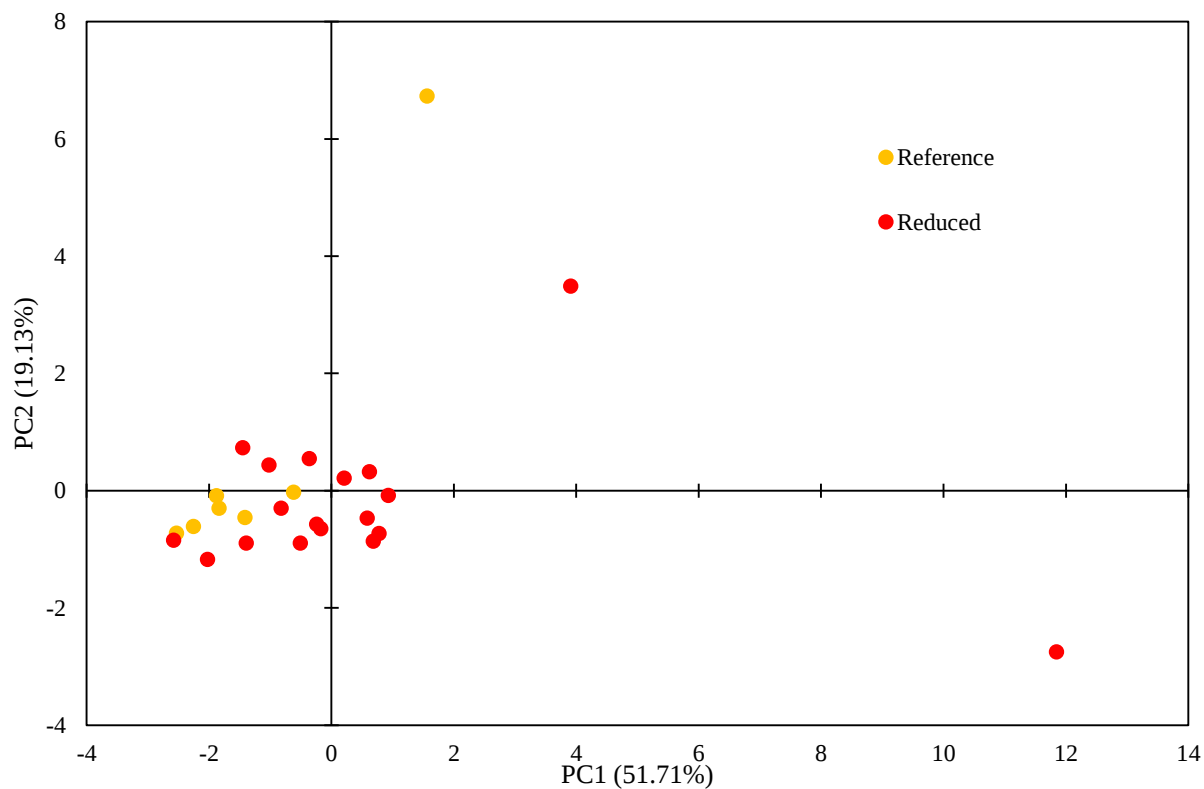


Figure 13. Ion PCA plot of PC 1 (51.7%) against PC 2 (19.1%)

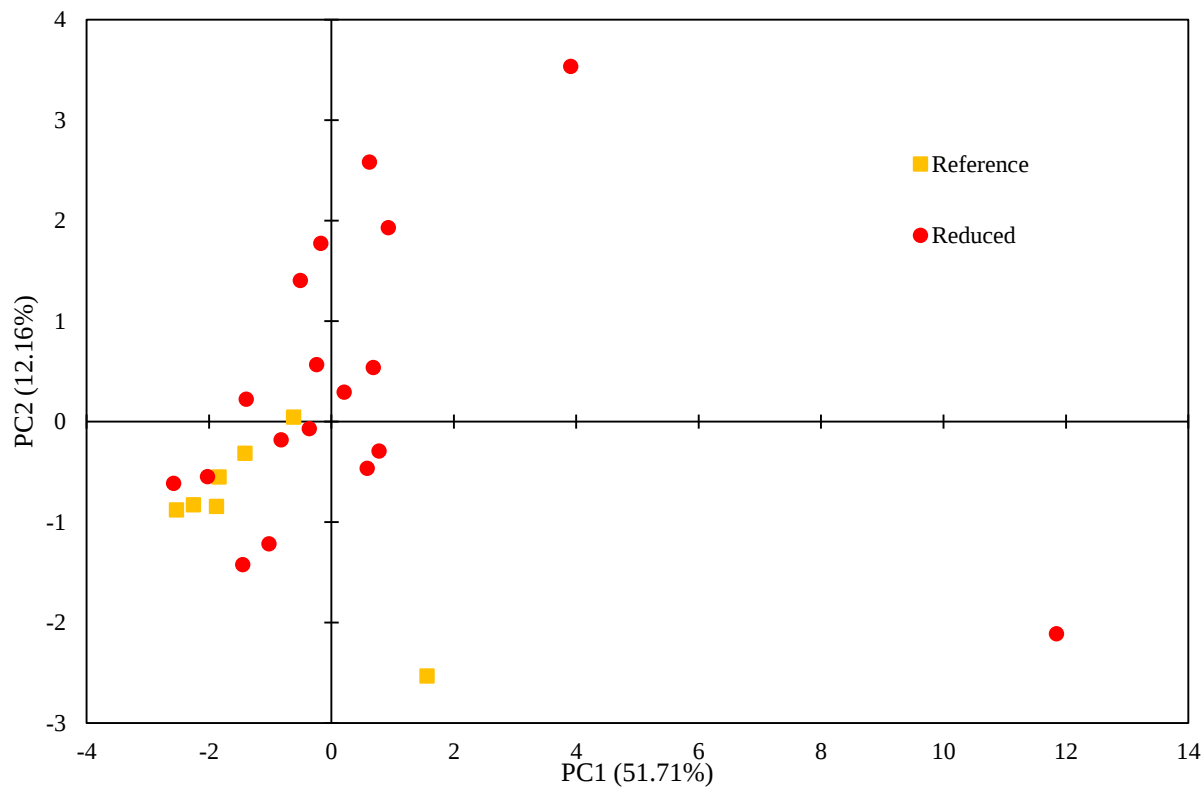


Figure 14. Ion PCA plot of PC 1 (51.7%) against PC 3 (12.2%)

N12 scores very high in PC 1 and negatively in both PC 2 and PC 3, quite possibly due to its high concentration of  $\text{NO}_3^-$  and organic acids, specifically glycolate, formate, and oxalate. n11 scores high in all three PCs, likely due to its high  $\text{NH}_4^+$ ,  $\text{Ca}^{2+}$ , acetate, formate, and  $\text{SO}_4^{2-}$ . n3 however scores only barely higher in PC 1 than the main cluster of samples, while it has the highest PC 2 score and lowest PC 3 score. This could be attributed to its high concentrations of  $\text{Na}^+$ ,  $\text{K}^+$ ,  $\text{Ca}^{2+}$  and  $\text{Mg}^{2+}$ . PC 2 weights  $\text{NO}_3^-$  and  $\text{Na}^+$  most positively with  $\text{K}^+$  and  $\text{Ca}^{2+}$  weighted most negatively. PC 2 also favors formate over acetate and oxalate, suggesting that higher PC 2 scores indicate more oxidative processing but less biomass burning influence. PC 3 weights  $\text{NH}_4^+$ , acetate, formate, and  $\text{Cl}^-$  most positively while weighting strongly against DOC.

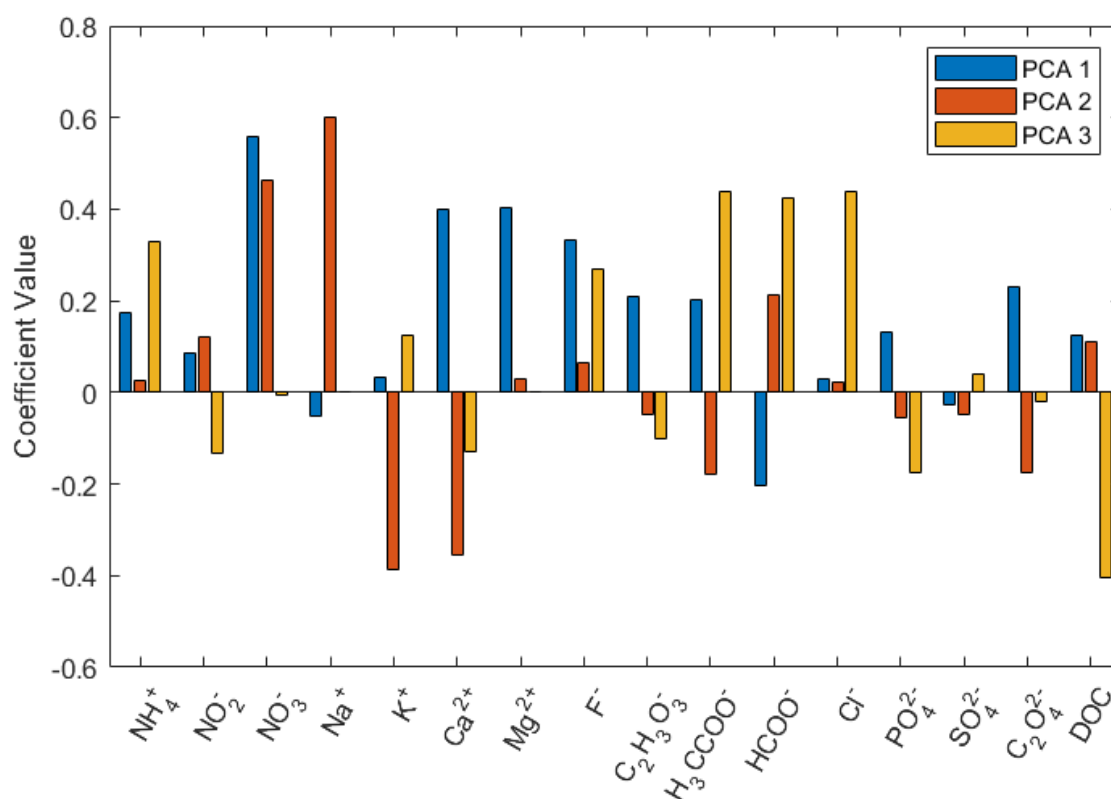


Figure 15. Component Factor loadings for major ions and DOC (n = 25)

Adjusting the PCA by removing the strongly outlying samples shows a more balanced PCA than the unaltered PCA, displayed in Figure 16 compared to Figures 13 and 15. However, this trimmed PCA does not strictly cluster samples into discrete groups that can easily be distinguished. Since n3, n11, n12 are thought to be heavily influenced by biomass burning or agriculturally related soil resuspension, removing these samples from the PCA leaves samples that are either more subtly related to these emission sources or related to vehicles, industry, biogenic emissions. The component loadings as shown in Figure 17 indicate how each species is weighted in the PCA. Both PC 1 and 2 weight reactive nitrogen species positively, suggesting samples in quadrant I (Q1) have agricultural influence. PC 1 and 2 both weight  $\text{Na}^+$  and  $\text{Ca}^{2+}$  negatively but differ on  $\text{K}^+$  and  $\text{Mg}^{2+}$ , with PC 1 weighting them positively and PC 2 weighting them negatively. This might place samples with biomass burning influence in quadrant IV (Q4). PC 2 weights  $\text{SO}_4^{2-}$  very positively while PC 1 weights DOC very positively. As for organic acids, glycolate weights positively and oxalate weight negatively in both PC 1 and 2, while acetate weights negatively in PC 2 and formate weights positively in PC 1.

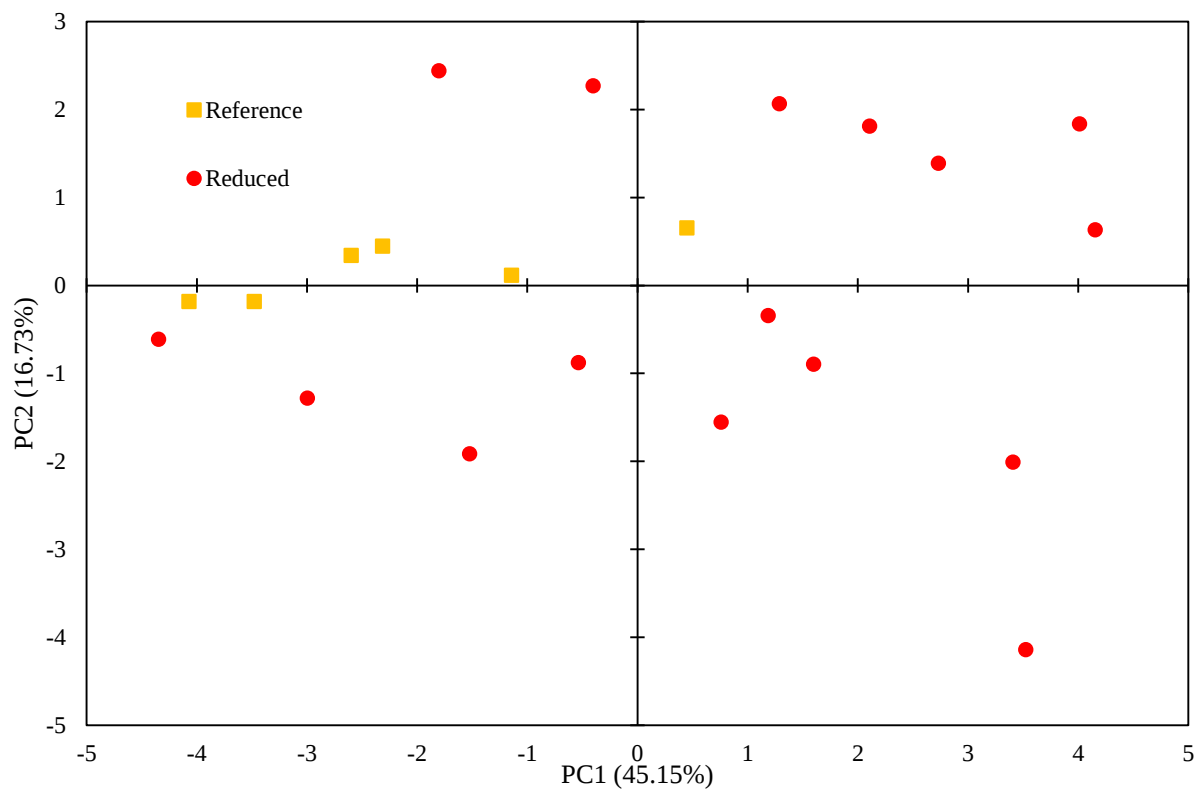


Figure 16. Ion PCA plot of PCA 1 (45.2%) against PCA 2 (16.7%) with outliers removed (n = 22)

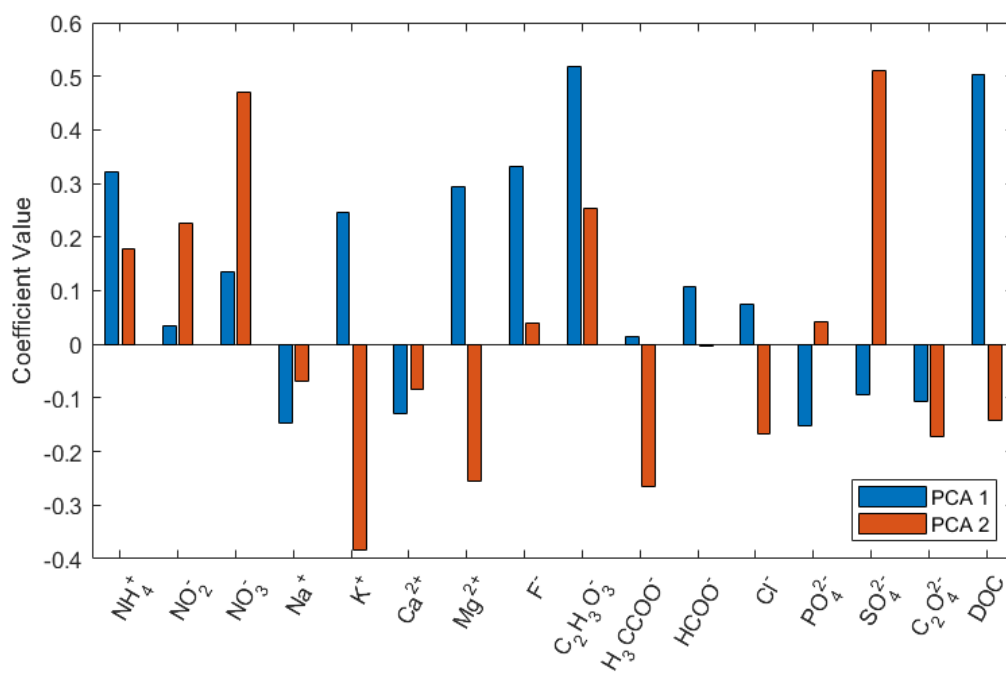


Figure 17. Component Factor loadings for major ions and DOC (n = 22) with outliers removed

Alternatively labelling the PC plot with information from other analysis reveals how effectively the ion PCA differentiates or clusters the samples presented. In Figure 16, the Reference period samples cluster tightly on the PC 2 axis but have more variance within PC 1. This suggests that the Reference period samples are rather similar in regards to PC 2. Figure 18(a) shows that dry season samples tend to cluster near the top of the PCA plot with similar PC 2 scores but may vary more along PC 1. This might suggest that the differences of the Reference samples relative to the Reduced group may be due in part to the season the samples were collected. More ion data is required to better understand the extent of this influence.

Figure 18(c) indicates how the organic character PCA and ion PCA compare in their clustering. Samples with organic PCA scores in Q4 show clustering in quadrant II (Q2) of the ion PCA. These samples comprise the Reference group, indicating that the Reference samples are distinct from Reduced activity samples in both ion composition and organic matter character. Because other organic character PCA groups don't show as strong clustering as the Q4 group in Figure 18(c), this could suggest that organic matter character and ion composition for these samples may not be as strongly related to each other in Reduced activity samples. Conversely, this suggests that organic matter character and ion composition are related in Reference group samples, indicating strong similarity in either emission source or secondary production.

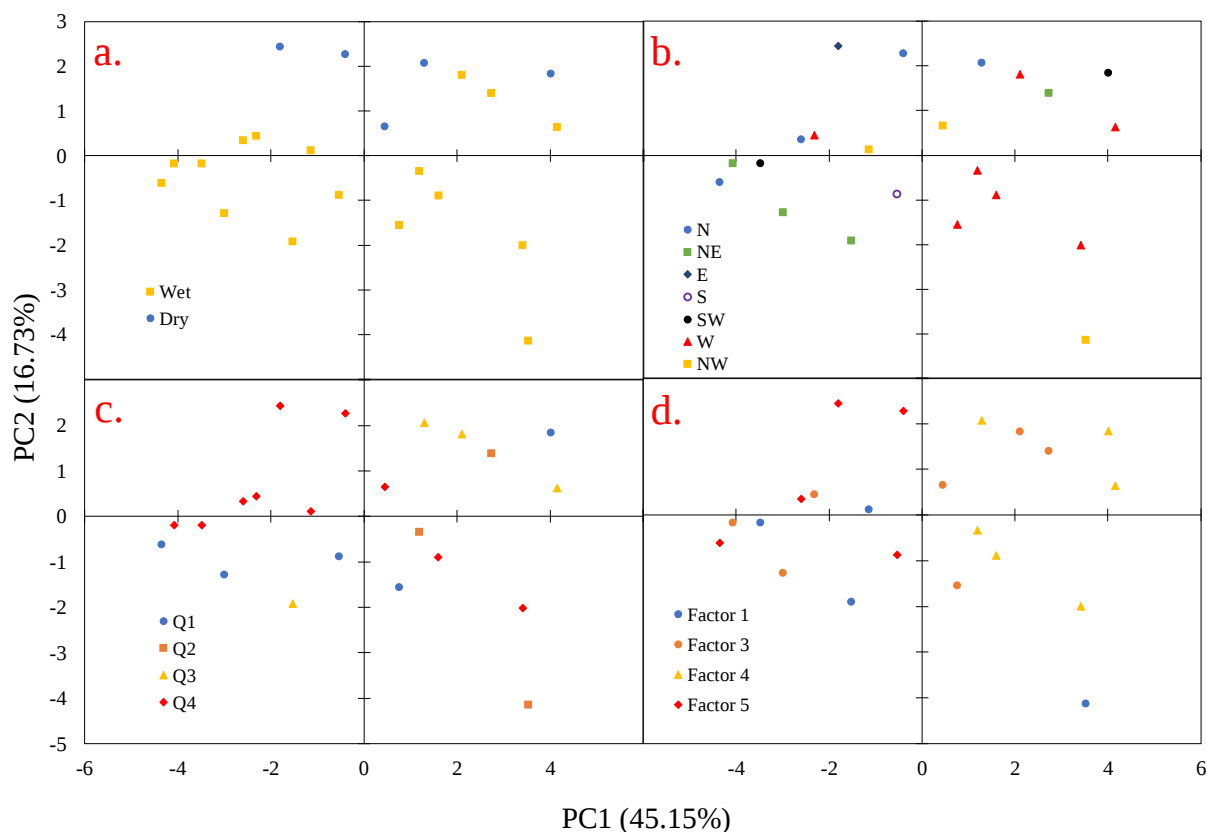


Figure 18. Inorganic Ion PCA plots of PCA 1 (45.2%) against PCA 2 (16.7%) with outliers removed ( $n = 22$ ) labeled by groupings of (a) season, (b) HYSPLIT backtrajectory, (c) quadrant the sample is located in the organic PCA plot, (d) primary PMF factor contributor from the combined five factor PMF model. Factor 2 was not the primary factor contributor for any sample in this figure, but was the primary factor contributor for n11 and n12 which were removed in the base PCA.

### 3.5 Combined PCA

Incorporating organic character parameters into the PCA model further expounds on the characteristics of the arising clusters. Figure 19 shows the PCA clustering plot arising from the union of inorganic ion and DOM characteristic data. This plot clusters Reference sample very tightly on PC 2 with wider variation in PC 1. These Reference period samples all present positive PC 2 values with mostly negative PC 1 values, thus located in Q2. The Reduced activity samples then inhabit a wide range of various regions of the PCA, with the samples closest to the return to Post-baseline date appearing close to the Reference cluster in Q2. Looking at the drivers of

clustering, exhibited in the PCA loadings plot in Figure 20, parameters located closely to one another are generally believed to be related parameters in terms of emission source.  $\text{Mg}^{2+}$  and  $\text{K}^+$  are very close to DBE in Q1, indicating that these species are most likely related through biomass burning. O:C and O:N are both collocated at the top of the plot, indicated that more oxidized species appear close to the top of the PCA plots via strong PC 1 values. Since most Reduced samples in Figure 19 fall below zero in PC 1, this may indicate that the Reduced samples are mostly less oxidized than the Reference period samples as well as indicate that the Reduced samples located far in Q1 are biomass burning related. The location of  $\text{Na}^+$  closer to the top of the loadings plot suggest that the presence of  $\text{Na}^+$  in this system is related to biomass burning rather than marine influence, as seen in other studies that correlate its presence to marine influence with  $\text{Cl}^-$ . All the quantitated organic acids and reactive nitrogen species, along with  $\text{F}^-$  and  $\text{Cl}^-$  as well as DOC and DON, appear rather closely in Q4. This may suggest that these parameters are related through anthropogenic activity. Because the organic acid constituents are considered part of the DOC fraction, it is not surprising that they are closely weighted in the PCA. Their relation to  $\text{NO}_3^-$  and DON are more revealing in that it suggests that reactive nitrogen, organic nitrogen, and organic acids are moderately linked in emission source. Indeed, recent studies have also highlighted organic acids as notable anthropogenic emissions contributors.<sup>95</sup> Both H:C and N:C appear in Q3, suggesting that less oxidized species and more nitrogenated species are placed towards the bottom of the PCA. These atomic ratios though, as previously discussed, are rather stable in all samples and they can simply be considered as balancing parameters in the PCA. Balancing these ratios, the distribution of parameters in the RHS cluster is more relevant to understanding the drivers of the PCA clustering. Following that reactive nitrogen species and DON are centrally located, compounds that incorporate

atmospheric  $\text{NO}_x$  would be located towards the center left of the PCA. These drivers indicate that the Reference period samples all have similar levels of oxidation and are likely influenced by chemical exchange with atmospheric reactive nitrogen, which is not present in most Reduced activity samples. The decrease in anthropogenic emissions, particularly vehicle-related  $\text{NO}_x$ , is the most probable driver in the reduction of these  $\text{NO}_x$  influenced characteristics. Conversely, the  $\text{NO}_x$  influenced characteristics in the Reference period samples are indicative of the larger influence of vehicle-related  $\text{NO}_x$  and other anthropogenic emissions during this period.

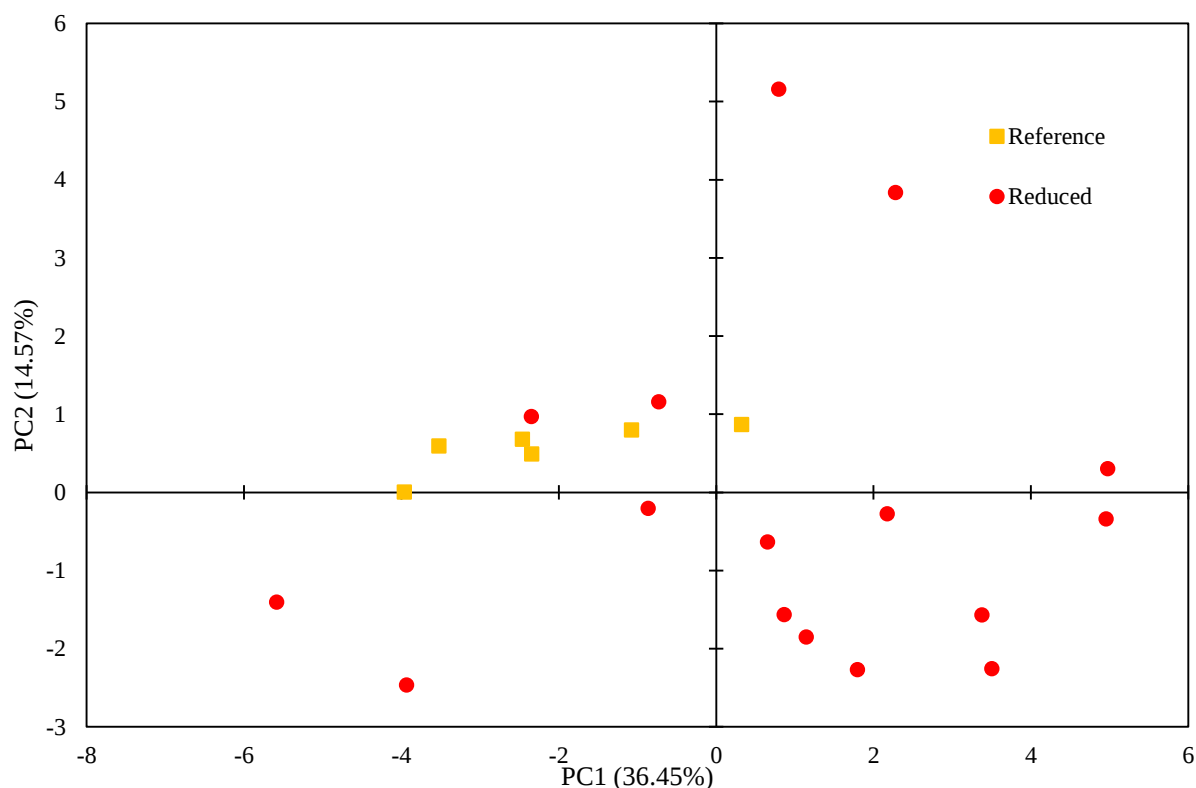


Figure 19. Combined Inorganic and Organic PCA plot of PCA 1 (36.5%) against PCA 2 (14.6%) with outliers removed (n = 22)

Performing a simple Pearson correlation calculation of all parameters also indicates (shown in Table A7) that parameters like  $\text{NO}_3^-$ ,  $\text{K}^+$ ,  $\text{F}^-$ ,  $\text{Cl}^-$ ,  $\text{PO}_4^{3-}$ , and the organic acids are

positively correlated to DBE in the DOM fraction and to each other rather strongly. Inversely, H:C is negatively correlated to all these parameters and to DBE. The strongest correlation that O:C has with any other parameter are with the other oxygen ratios, O:N and O:S. It appears that O:C ratio does not have simple direct relationships with other parameters. It does however negatively correlate with  $\text{NO}_3^-$ ,  $\text{K}^+$ ,  $\text{F}^-$ ,  $\text{Cl}^-$ ,  $\text{PO}_4^{3-}$ , and the organic acids slightly. Ions such as  $\text{Na}^+$ ,  $\text{Ca}^{2+}$ ,  $\text{Mg}^{2+}$ , and  $\text{K}^+$  are strongly correlated to each other, likely indicating these parameters are related through mechanical suspension of soils.  $\text{SO}_4^{2-}$  strongly correlates with  $\text{NH}_4^+$  and  $\text{NO}_3^-$  as well as the organic acids. It also slightly correlates to DBE, suggesting that it is not marine related but more likely a combustion product.

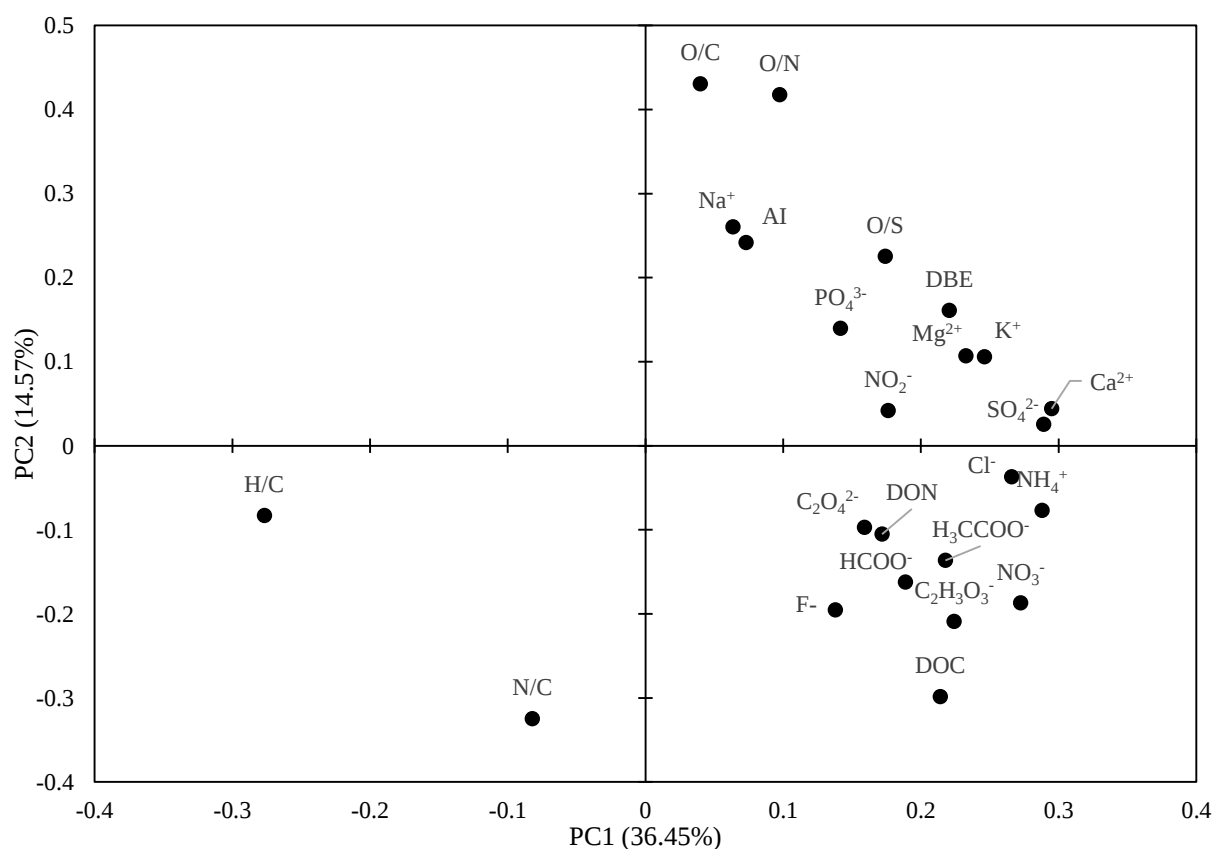


Figure 20. Combined Inorganic and Organic PCA loadings plot of PCA 1 (36.5%) against PCA 2 (14.6%) with outliers removed (n = 22)

### 3.6 Positive Matrix Factorization

As previously discussed, because the distance from the observation site to the South Atlantic Ocean is about 338 kilometers, its position geographically puts Ribeirão Preto virtually free from influence by the Atlantic. Confirming this, all previous analysis in this study have pointed to typical marine indicators like  $\text{Cl}^-$ ,  $\text{SO}_4^{2-}$ , and  $\text{Na}^+$  as being combustion or soil suspension in origin. Thus, marine emissions are eliminated as a potential source of emissions.

Since most of the energy produced in Brazil is from hydroelectric power; coal, petroleum, and natural gas burning power plants can also be ruled out as a significant source of emissions. This leaves agriculture, soil resuspension, vehicles, industry, biogenic emissions, and biomass burning as the remaining major potential sources of emissions for Ribeirão Preto.

The factor profiles for all inorganic species and quantitated organic acids are presented in Figure 21 and in Figure 22 where outliers are removed. Concerning the base PMF factor profiles for all samples with inorganic ion data available, most species are associated with either three or four factors, with only  $\text{PO}_4^{3-}$  and  $\text{C}_2\text{O}_4^{2-}$  associated with two factors.  $\text{NO}_2^-$ ,  $\text{Ca}^{2+}$ , and  $\text{Cl}^-$  are the only species associated with all five factors. Based on the prominence of  $\text{Na}^+$ ,  $\text{Ca}^{2+}$ ,  $\text{Mg}^{2+}$ , formate and  $\text{SO}_4^{2-}$  in the factor 5 profile, the factor can be assigned as some combination of soil resuspension and industrial activity. Factor 5 also shows a  $\text{K}^+/\text{Ca}^{2+}$  ratio of 0.524, which is most similar ratio to the one found by Coelho et. al. 2011 (0.0126) for resuspended soil dust.<sup>65</sup> The  $\text{K}^+/\text{Ca}^{2+}$  ratios for factors 1, 2, 3, and 4 are 0.686, 1.009, 6.890, 0.603 respectively, suggesting either factor 2 or 3 could be influenced by agricultural activity or sugar cane smoke based on their elevated  $\text{K}^+/\text{Ca}^{2+}$  ratio, similar to the relationship found by Coelho et. al. 2011 (1.19). The prominence of both  $\text{NH}_4^+$  and  $\text{PO}_4^{3-}$  lends credence to assigning factor 4 as agricultural emissions, while the dominance of both  $\text{NH}_4^+$  and  $\text{NO}_3^-$  in factor 1 suggest more vehicle

emission influence. Indeed, factor 1 has the lowest  $\text{HCOO}^-/\text{H}_3\text{CCOO}^-$  ratio with 0.515, supporting the notion it may represent direct vehicle emissions or anthropogenic nitrogen inputs. Biomass burning, biogenic emissions and direct vehicular emissions tend to favor emission of acetic acid relative to formic acid.<sup>104</sup> With  $\text{HCOO}^-/\text{H}_3\text{CCOO}^-$  ratios being 0.515, 0.881, 1.185, undefined, and 0.000 for factors 1, 2, 3, 4, and 5 respectively, it is plausible that factors 1, 2, or 5 are related to biomass burning, biogenic emissions or direct vehicular emissions. Other studies have demonstrated that direct traffic formate:acetate ratios tend to be closer to 0.25 and increases in that ratio may be related to photochemical production of formate by  $\text{H}_2\text{CO}$  oxidation.<sup>105</sup> This would indicate the factors here, even if they do represent vehicle emissions, are likely more oxidized than direct traffic emissions. Following that, factor 3 is likely to be biomass burning based on the dominance of  $\text{NO}_2^-$  and the  $\text{HCOO}^-/\text{H}_3\text{CCOO}^-$  ratio favoring acetate, however  $\text{PO}_4^{3-}$  is not a contributor to this factor profile which is typically associated with agricultural emissions.

Overall, assigning emission sources for each factor in the base inorganic ion and organic acid PMF model is inconclusive. However, it does suggest that factor 5 may represent resuspended soil influence, factor 3 or 4 may be agriculturally influenced, factor 2 could be biomass burning, and factor 1 may be oxidized vehicle or urban emissions.

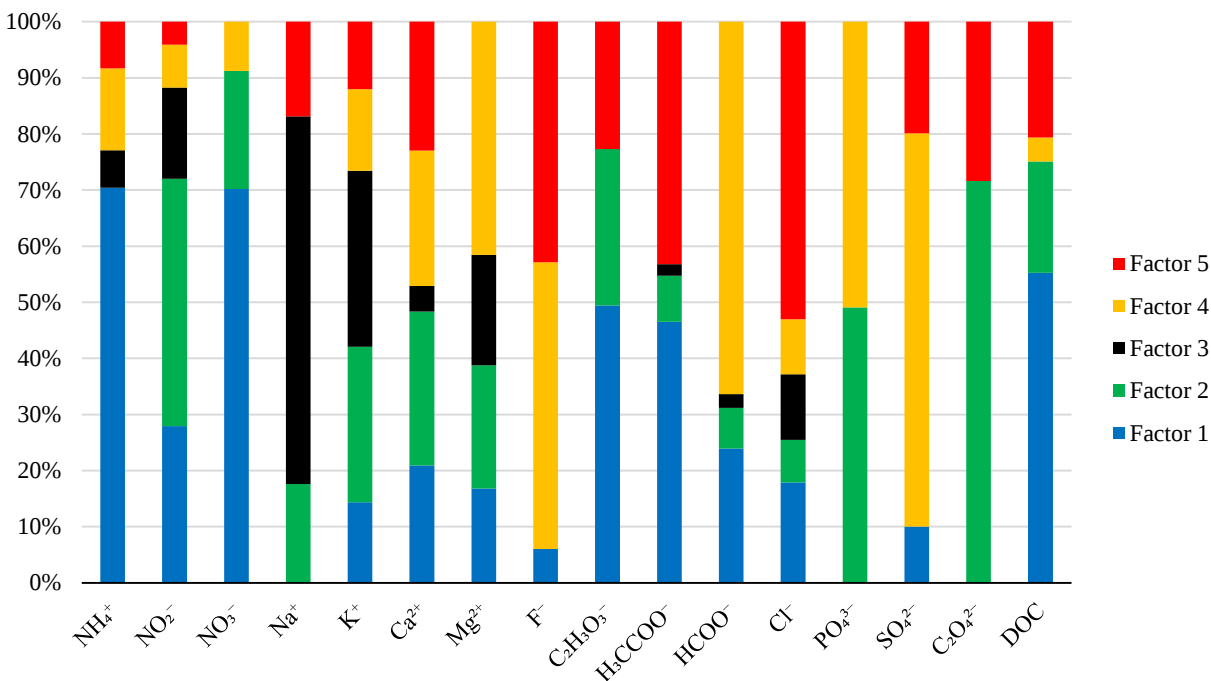


Figure 21. Factor Profiles of All Ion Species

Factor Profiles (percent of species sum) from Base Run #13 in the five factor PMF model of ion concentrations. (n = 24)

Simplifying by removing outliers in the base PMF model, specifically n4, n11, n12, and n13, may help reduce the uncertainty in assigning emission sources to the factor profiles. The n11, n12, and n13 outlier samples are believed to be biomass burning or agriculturally related due to their elevated DOC, formate, and K<sup>+</sup> concentrations while n4 may be more related to soil resuspension due to its high Ca<sup>2+</sup>, Cl<sup>-</sup> and Na<sup>+</sup> concentrations in addition to its high K<sup>+</sup> concentration. Removing these samples may help discern the other emissions source assignments drowned out by their strong signal in the model.

For the factor profiles present in Figure 22 representing the PMF model with outliers removed, most species did not decrease the number of associated factors compared to the base model. Instead, most species are associated with four factors with only NH<sub>4</sub><sup>+</sup>, NO<sub>2</sub><sup>-</sup>, and HCOO<sup>-</sup> being associated with three factors. PO<sub>4</sub><sup>3-</sup> is still only associated with two factors, factors 2 and 4.

Factor 1 can be likely thought of as soil resuspension due to its  $\text{Na}^+$ ,  $\text{Ca}^{2+}$ ,  $\text{Mg}^{2+}$ , and  $\text{SO}_4^{2-}$  prevalence. This factor has only formate present and not acetate in its profile and its  $\text{K}^+/\text{Ca}^{2+}$  ratio is the lowest of any of the  $\text{K}^+$  containing factors. Factor 2 is likely agriculturally related due to the prevalence of nitrogen species,  $\text{K}^+$ ,  $\text{PO}_4^{3-}$ , and DOC. Factor 2 also has a formate:acetate ratio of 0.000 and a  $\text{K}^+/\text{Ca}^{2+}$  of 6.170, indicating it favors acetate and has the highest  $\text{K}^+/\text{Ca}^{2+}$  of all factors. Factor 3 and 4 are difficult to constrain. Both  $\text{F}^-$  and  $\text{Cl}^-$  are prominent in their profiles along with notable portions of the organic acids. Both have low formate:acetate ratios however factor 3 has a  $\text{K}^+/\text{Ca}^{2+}$  ratio of 0.0817 while factor 4 is 0.000. This may suggest they are related to industrial or anthropogenic activity, but their assignments are generally inconclusive. Factor 5 is likely same vehicle or urban emission signature as factor 1 in the base PMF model, as can be seen by the proportions of the nitrogen species and organic acids.

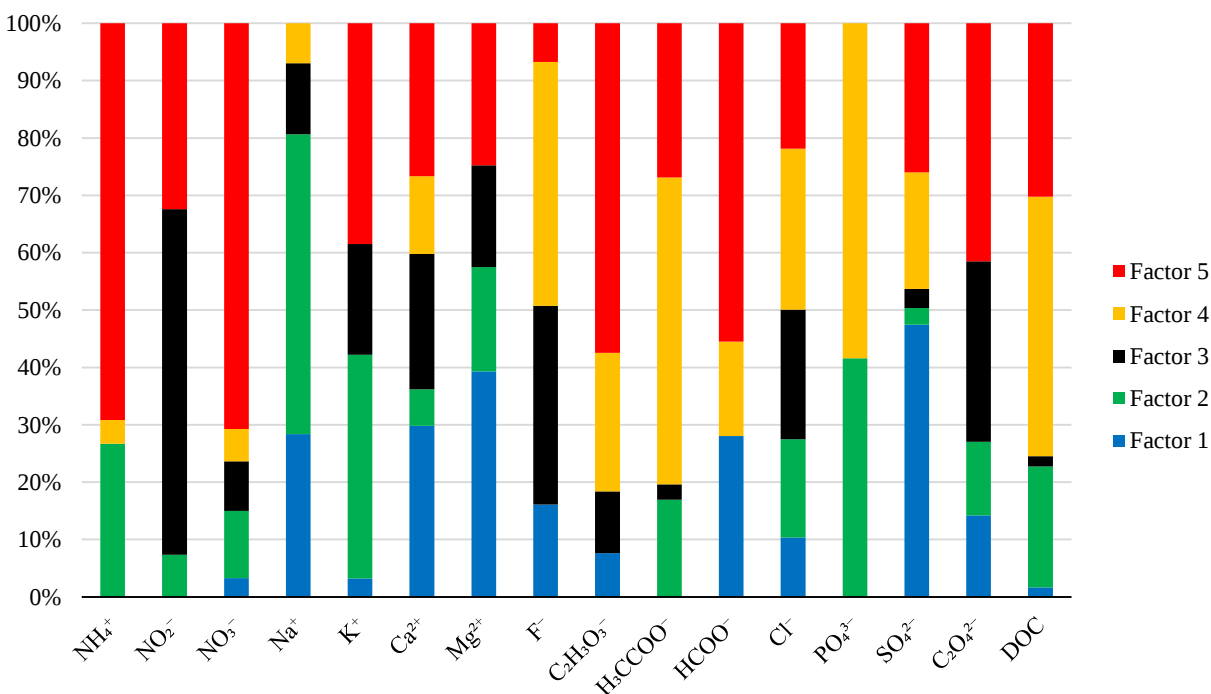


Figure 22. Factor Profiles of All Ion Species excluding Outliers

Factor Profiles (percent of species sum) from Base Run #3 in the five factor PMF model of ion concentrations, excluding outlier samples. (n = 20)

### 3.7 Combined PMF

Bringing DOM characteristics into the model may elaborate on the potential DOM characteristics associated with the factor profiles. The combined PMF factor profiles presented in Figure 23 are mostly similar to the base model PMF concerning only the inorganic ion species and organic acids. Factor 1 is most similar to factor 5 in the base model while factor 2 is to factor 4 in the base model, factor 3 is to factor 2 in the base model, factor 4 is to factor 1 in the base model, and factor 5 is to factor 3 in the base model. Their factor profile analysis earlier in the base model discussion is applicable here.

The organic parameters have little variation to them. Relative to the standard deviations of the inorganic species, the organic parameters have much larger deviations and are not the drivers of the model. For instance, the maximum relative standard deviation for any inorganic species is 5%, while the average relative standard deviation for the organic parameters is over 100% simply due to the wide diversity of organic species in the DOM fraction. The nature of these organic parameters are simply not highly compatible with the way PMF models function. To then try to infer emissions properties from their representation in any factor profile would lead to invalid assertions. For example, factor 2 is not represented in any organic parameter, which would imply that factor 2's corresponding emission signature lacks DOM, which can easily be dismissed by observing that DOC is present in factor 2's profile. However, information that can still be gleaned from this combined PMF model is that atomic ratios and DBE alone are not enough to profile emission signatures. The model also implies that factor 4 may contain the most oxidized and aromatic DOM constituents, as its profile has the largest representation in the oxygen ratios and AI. This would corroborate the idea that factor 4 represents combustion products from vehicle and urban emissions, but would also imply that factor 1 (possibly

representing resuspended soils) is more oxidized and aromatic than factor 5 and factor 3 (possibly representing agricultural influence and biomass burning respectively).

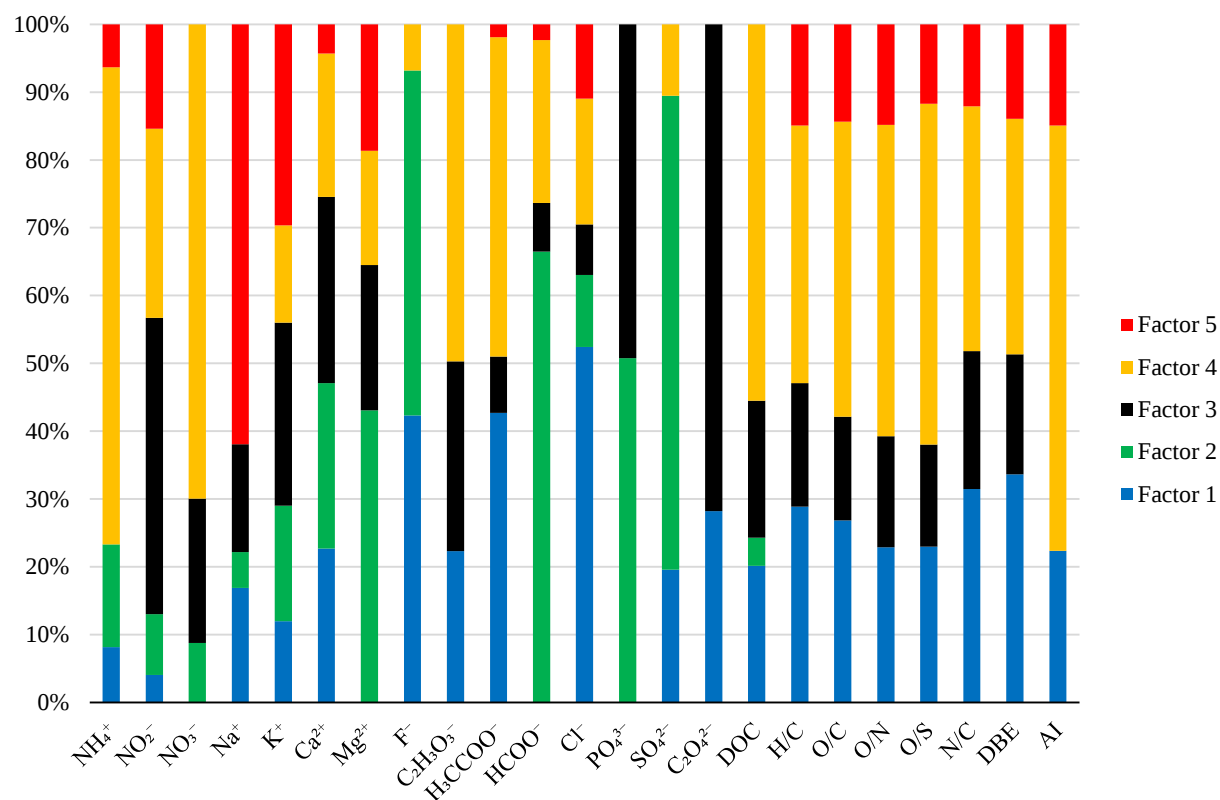


Figure 23. Combined PMF Factor Profiles of all parameters.

Factor Profiles (percent of species sum) from Base Run #14 in the five factor PMF model of inorganic, organic acid concentrations, and DOM characteristics. (n = 24)

## CHAPTER IV. CONCLUSIONS AND IMPLICATIONS

Demonstrating the use of electrospray ionization ultrahigh-resolution Orbitrap mass spectrometry (ESI-UHRMS) for atmospheric organic characterization, the molecular characterization of DOM in continental Brazilian rainwater provides insight into the variability of atmospheric WSOC and WSON. Rainwater DOM shows significant variety in its chemical composition which can inform source apportionment and displays its dynamic role in many environmental processes. This form of analysis presents a high throughput method that supports the study of biologically relevant organics in the atmosphere which are meaningful to public health and ecosystems.

WSON represents a significant part of overall chemical character in the analyzed continental rainwater DOM, suggesting that true rainwater DOM character content is strongly influenced if not dominated by DON. Nitrogen containing species represent 86.0% of the organic compounds identified, many of these likely peptides or amino acid derivatives. While direct contribution of amino acids typically ranges from only 2-25% of total WSON,<sup>84,85</sup> their true contribution to total WSON is likely higher. Further exploration focusing on their secondary contributors could very well elucidate and constraint the upper bound of their contribution. Other studies that miss this large contribution of WSON may vastly underestimate the bioavailability of rainwater DOM.

The general proportions of classes of molecules as well as the proportions of them that contain specific heteroatoms remain relatively stable over the many samples presented. The average atomic ratios may differ sample to sample, indicating changes in the variety and atomic ratios of compounds within specific classes, but the proportions of the classes remain relatively

stable. Averaging along the different groupings of samples yields no significant differences between these class proportions.

This continental rainwater OM shows distinct evidence indicative of secondary processing and oxidized anthropogenic urban/vehicular emissions, however missing some key components shown in other studies such as CHO and CHON formulas with O:C ratios between 0.35 and 0.85.<sup>44</sup> Kendrick analysis identifies a series of related CHON oligomers, which are known markers of oxidized anthropogenic emissions. These oligomers play a strong role in distinguishing organic character in clustering analysis. The samples distinguished by these oligomers are largely prepandemic and samples collected towards the beginning of 2021, concerning the Reference and Post-baseline groups, thus markedly absent from samples collected in the months following the height of social isolation measures, April to November 2020. This change in the presence of these oligomers is likely in response to a strong reduction in ambient NO<sub>x</sub> concentrations, which is corroborated in concurrent air quality monitoring studies.<sup>61</sup> The incorporation of this reactive nitrogen into DOM alters its properties and is a potential explanation for rainwater DOM's high bioavailability relative to other matrices.

Volcano plotting suggests that while despite an increase in average ambient ozone concentration, the proportion of primary species present, namely direct amino acid contributors and other biosynthetic compounds, increased with less secondary processing during the Reduced period. Condensed and aromatic compounds became more common going into the Reduced and Post-baseline periods and are likely biomass burning related species that became more prevalent as wildfire season progressed. Typical BC compounds were not found, but more water-soluble potential secondary products of BC were present. Possible indicators for seasonal BVOCs in this region may have been identified in carbamates and palmitates, however the novelty of volcano

plot analysis in environmental study and its high rate of false positives—also called type I errors—gives cause for concern and further consideration.

Further contrasting the chemical character of samples before and after the institution of partial lockdown orders, PCA analysis shows that Reference period rainwater is distinct from Reduced activity rainwater in both DOM character and major inorganic ion content. However, these distinctions are lost approaching the Post-baseline period. Reference period and Post-baseline DOM is distinguished by a higher variety of unique compounds and the CHON oligomers previously discussed while ion content is distinguished by a reduction in sulfate, nitrate, potassium, and formate in Reduced activity samples. The influences of seasonality on these effects are difficult to constrain and likely a contributor to inorganic variation. More data regarding the inorganic species is necessary to clarify this relationship. HYSPLIT analysis indicates no strong spatial influence on DOM character nor inorganic ion content, indicating that local emissions prevail over long-range transport. Other studies in this region have suggested the same.<sup>65,88</sup> Analyzing both organic and inorganic content in tandem reveals the relationships among inorganic and organic character parameters. Reactive nitrogen, organic nitrogen, and organic acids appear close in PCA loadings indicating that they are moderately linked in emission source. Attempting to do the same using PMF is misleading as bulk organic characteristic parameters such as atomic ratios and DBE tend to be incompatible with how the PMF analysis functions. Parameters such as  $\text{NO}_3^-$ ,  $\text{K}^+$ ,  $\text{F}^-$ ,  $\text{Cl}^-$ ,  $\text{PO}_4^{3-}$ , and the organic acids are positively correlated to DBE in the DOM fraction and to each other rather strongly. Inversely, H:C is negatively correlated to all these parameters and to DBE. While O:C ratio does negatively correlate with  $\text{NO}_3^-$ ,  $\text{K}^+$ ,  $\text{F}^-$ ,  $\text{Cl}^-$ ,  $\text{PO}_4^{3-}$ , and the organic acids slightly, it does not have simple direct relationships with other parameters.

While the consequences of pandemic related public policies are multifaceted and complex in effect, this work highlights the potential for public policy to reduce the emission of air pollutants and other biologically relevant anthropogenic emissions, particularly through reducing traffic loading and expanding remote working. Investigating both the organic and inorganic constituents of rainwater chemical character provides a fuller picture of the important components that indicate emission profiles and contributions. Orbitrap ESI-UHRMS and traditional IC methods provide a complementary set of data that can be thoroughly deconstructed through powerful statistical tools such as PCA, volcano plotting, and PMF. These methods demonstrate a high-throughput method with minimal sample prep that lay the groundwork for building a more comprehensive inventory of atmospheric OM as well as constraining the influences of emission sources.

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## APPENDIX A.

### SUPPLEMENTAL FIGURES AND TABLES

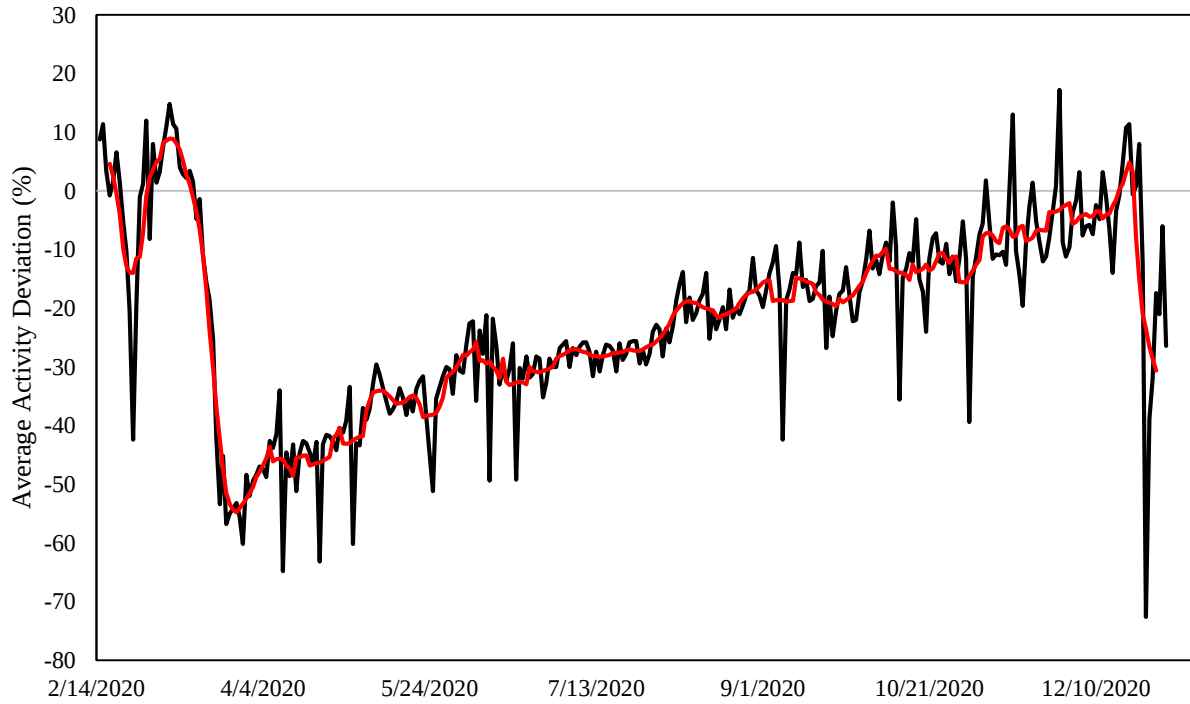


Figure A1. Average activity deviation of retail, transit, and workplace areas in Ribeirão Preto relative to the two months prior to February 16, 2020. Red line represents rolling seven-day average. Data retrieved from the Google COVID-19 Community Mobility Reports.<sup>64</sup>

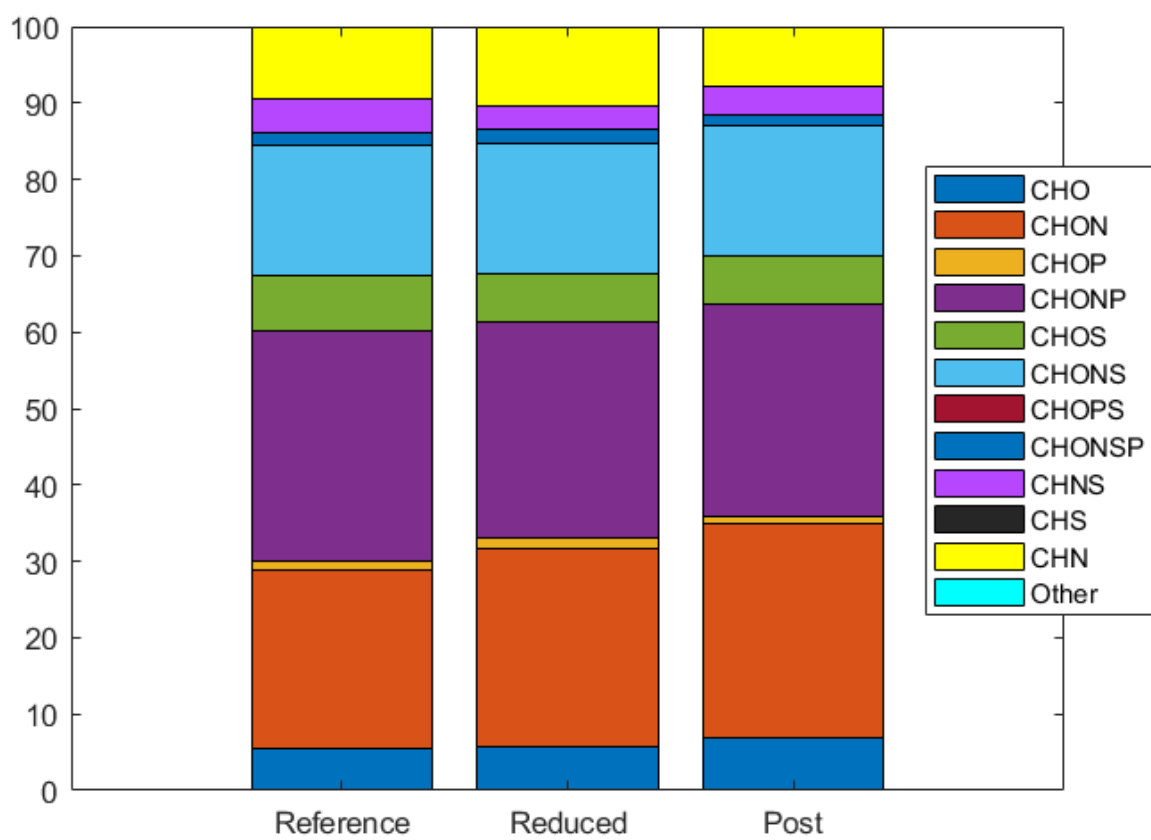


Figure A2. Percent composition of sample grouping

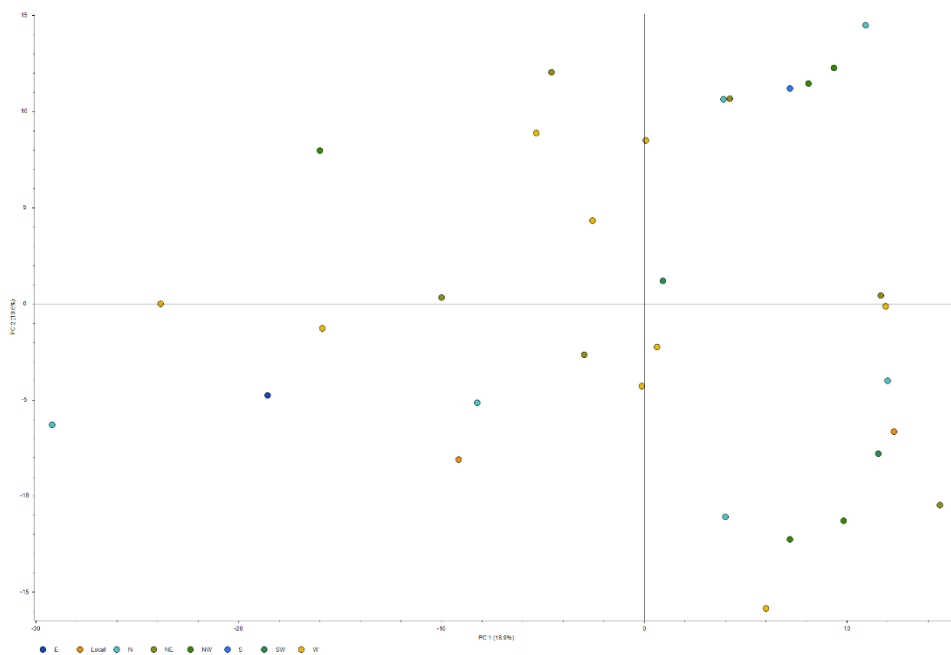


Figure A3. Organic Character PCA plot of all samples, labeled by HYSPLIT backtrajectory grouping.

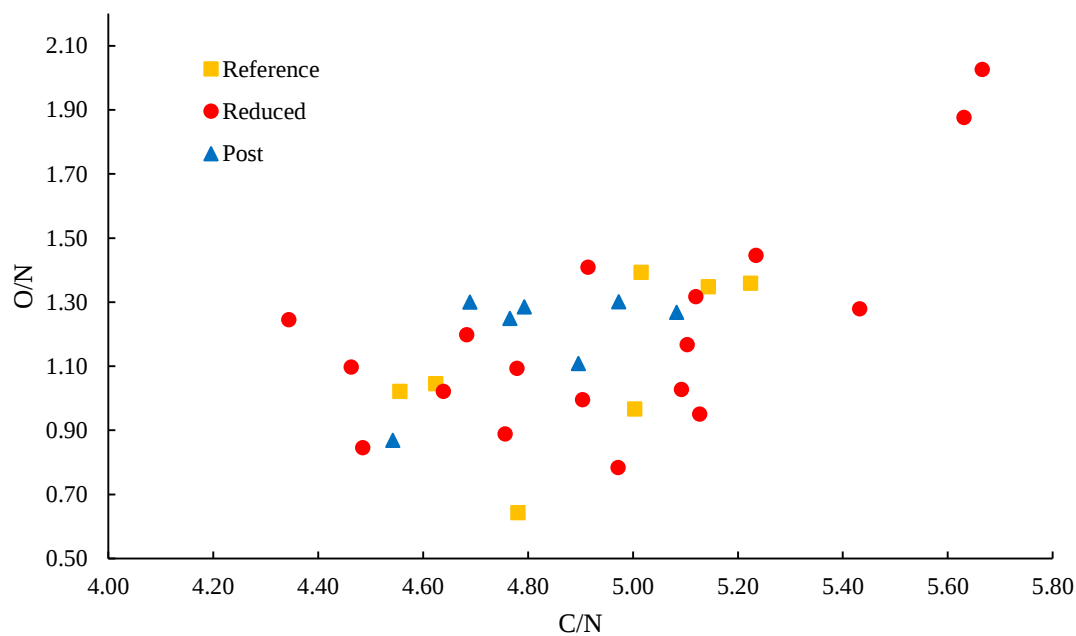


Figure A4. Atomic ratio analysis for nitrogen

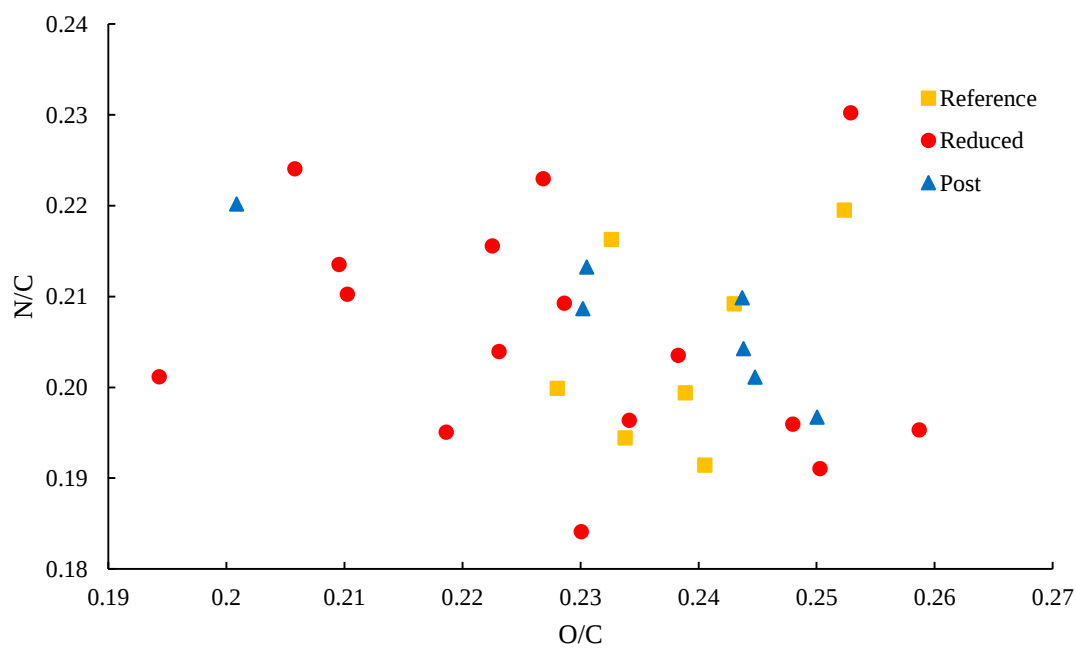


Figure A5.

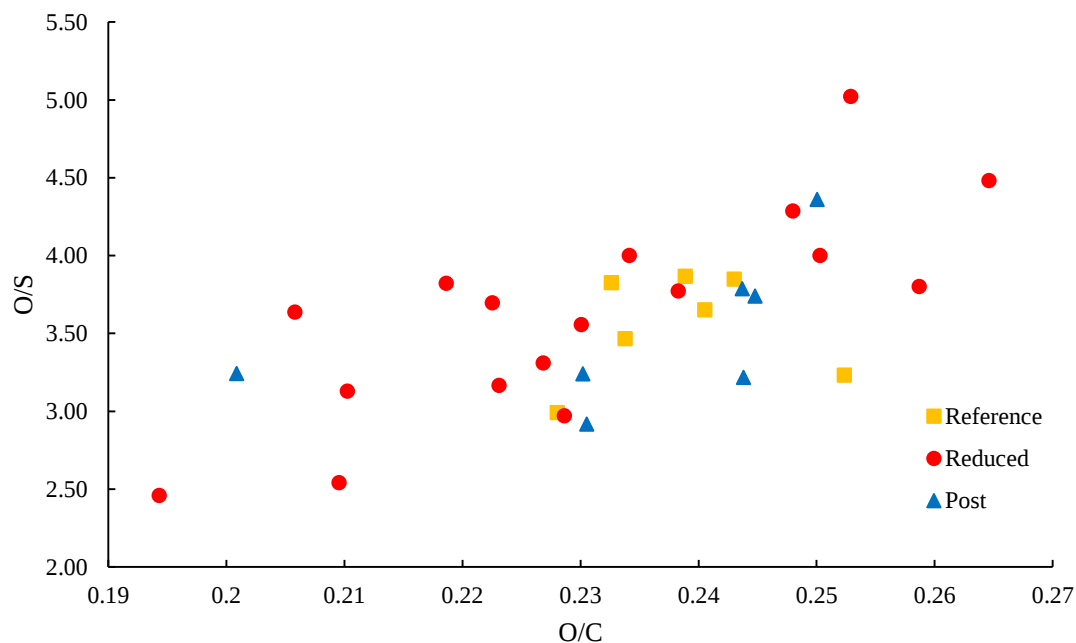


Figure A6.

| Predicted Compound                                                                           | Predicted Formula | Calculated MW | m/z      |
|----------------------------------------------------------------------------------------------|-------------------|---------------|----------|
| L-Phenylalanine                                                                              | C9 H11 N O2       | 165.0789      | 166.0862 |
|                                                                                              |                   | 217.9427      | 109.9786 |
|                                                                                              | C20 H39 N O7      | 405.2724      | 406.2797 |
| THIOQUINOX                                                                                   | C9 H4 N2 S3       | 235.9532      | 118.9839 |
|                                                                                              | C10 H N3 O4 S     | 258.9691      | 130.4918 |
| O-ureido-D-serine                                                                            | C4 H9 N3 O4       | 163.0597      | 82.53715 |
|                                                                                              |                   | 145.0225      | 146.0298 |
|                                                                                              |                   | 176.9679      | 159.9646 |
|                                                                                              |                   | 181.895       | 223.9288 |
| Phenethylamine                                                                               | C8 H11 N          | 121.0891      | 122.0964 |
|                                                                                              |                   | 145.0225      | 128.0192 |
|                                                                                              | C8 H7 O4 P        | 198.0079      | 100.0112 |
| N-{4-[(2R,3R)-3-(Hydroxymethyl)-4-isobutyl-5-oxo-2-morpholinyl]phenyl}cyclobutanecarboxamide | C20 H28 N2 O4     | 382.1965      | 383.2038 |
| toluidine                                                                                    | C7 H9 N           | 107.0735      | 108.0808 |
| SJ4950000                                                                                    | C6 H7 N O         | 109.0528      | 110.0601 |
|                                                                                              |                   | 253.9418      | 254.9491 |
|                                                                                              |                   | 117.9765      | 118.9839 |

|                                                       |               |          |          |
|-------------------------------------------------------|---------------|----------|----------|
|                                                       | C9 H7 N O2 S2 | 224.9917 | 225.999  |
|                                                       | C8 H7 O4 P    | 198.0079 | 100.0112 |
|                                                       | C4 H5 N O     | 83.03715 | 101.071  |
| AE4025000                                             | C8 H9 N O2    | 151.0632 | 152.0706 |
| (2E)-2-Bromo-4-oxo-2-hexenedioic acid                 | C6 H5 Br O5   | 235.9312 | 236.9385 |
|                                                       |               | 147.3233 | 148.3306 |
|                                                       |               | 303.8884 | 304.8957 |
| phendimetrazine                                       | C12 H17 N O   | 191.1309 | 192.1382 |
|                                                       |               | 100.977  | 101.9842 |
|                                                       | C3 H4 N3 O9 P | 256.9686 | 129.4915 |
|                                                       |               | 227.9368 | 135.489  |
|                                                       |               | 153.9001 | 154.9074 |
|                                                       |               | 141.9691 | 184.0029 |
| MFCD00130070                                          | C10 H21 N O   | 171.1622 | 172.1695 |
|                                                       |               | 172.0243 | 87.01944 |
| adrenaline                                            | C9 H13 N O3   | 183.0895 | 166.0862 |
|                                                       |               | 233.9526 | 117.9836 |
| (3E)-4-(4-Hydroxy-3,5-dimethoxyphenyl)-3-buten-2-one  | C12 H14 O4    | 222.0891 | 205.0858 |
|                                                       | C16 H37 N8 P  | 372.2873 | 373.2945 |
|                                                       |               | 333.9074 | 334.9147 |
|                                                       |               | 208.9696 | 105.4921 |
|                                                       | C10 H22 N2    | 170.1782 | 171.1855 |
|                                                       |               | 108.4717 | 109.4789 |
|                                                       |               | 180.1225 | 181.1298 |
|                                                       | C10 H N O3    | 182.9956 | 184.0029 |
|                                                       | C3 H2 O9 S    | 213.942  | 107.9783 |
|                                                       |               | 106.4687 | 89.46536 |
|                                                       | C7 H2 N3 O6 P | 254.9683 | 128.4914 |
|                                                       |               | 268.9634 | 135.489  |
|                                                       |               | 200.9683 | 201.9756 |
|                                                       |               | 97.46336 | 98.47065 |
|                                                       |               | 381.197  | 382.2042 |
| L-threo-3-Phenylserine                                | C9 H11 N O3   | 181.0738 | 182.0811 |
|                                                       |               | 212.9373 | 107.4759 |
| 2-((4-Nitrophenoxy)methyl)oxirane                     | C9 H9 N O4    | 195.053  | 196.0603 |
|                                                       |               | 179.8943 | 180.9016 |
|                                                       |               | 344.838  | 173.4263 |
| 2-Methylhippuric Acid                                 | C10 H11 N O3  | 193.0738 | 194.0811 |
| 5-acetyl-2,6-dimethyl-1,2,3,4-tetrahydropyridin-4-one | C9 H13 N O2   | 167.0945 | 168.1018 |
| Tyramine                                              | C8 H11 N O    | 137.084  | 138.0913 |
|                                                       | C12 H27 N     | 185.2143 | 186.2216 |

|                                                           |               |          |          |
|-----------------------------------------------------------|---------------|----------|----------|
| Umbelliferone                                             | C9 H6 O3      | 162.0316 | 163.0389 |
|                                                           |               | 126.9818 | 127.9891 |
|                                                           | C4 H9 N8 O5 P | 280.0436 | 281.0508 |
|                                                           |               | 255.9696 | 128.9921 |
| Phenethylamine                                            | C8 H11 N      | 121.0891 | 122.0964 |
|                                                           | C17 H31 N O6  | 345.2149 | 346.2221 |
| 2-Cyclopenten-1-one, 4-hydroxy-3-methyl-2-(2-pentenyl)-   | C11 H16 O2    | 180.115  | 181.1222 |
|                                                           |               | 356.1398 | 357.1471 |
|                                                           | C3 H4 O10 S   | 231.9526 | 116.9836 |
|                                                           |               | 232.9537 | 117.4841 |
|                                                           |               | 220.9209 | 221.9282 |
| Thymine                                                   | C5 H6 N2 O2   | 126.0429 | 127.0502 |
|                                                           |               | 344.84   | 173.4273 |
| Pyridoxal                                                 | C8 H9 N O3    | 167.0581 | 168.0654 |
|                                                           |               | 113.4901 | 114.4974 |
|                                                           |               | 257.892  | 258.8993 |
|                                                           | C17 H31 N O6  | 345.2148 | 346.2221 |
|                                                           | C10 H23 N7 O6 | 337.1714 | 338.1786 |
|                                                           |               | 92.97685 | 93.98413 |
| SJ6078000                                                 | C7 H9 N O     | 123.0684 | 124.0757 |
| (4S)-6-Methyl-2-oxa-6-azatricyclo[3.3.1.0~3,7~]nonan-4-ol | C8 H13 N O2   | 155.0946 | 138.0913 |
|                                                           |               | 218.9211 | 219.9284 |
|                                                           |               | 122.9331 | 263.8993 |
|                                                           |               | 177.8942 | 178.9015 |
|                                                           |               | 262.8921 | 263.8994 |
|                                                           | C16 H24 N P   | 261.1647 | 262.172  |
| Propoxur                                                  | C11 H15 N O3  | 209.1051 | 210.1123 |
| N-acetyldopamine                                          | C10 H13 N O3  | 195.0894 | 196.0967 |
| (+/-)-Metanephrene                                        | C10 H15 N O3  | 197.1051 | 198.1124 |
|                                                           |               | 390.101  | 391.1083 |
|                                                           | C16 H33 N O2  | 271.251  | 272.2582 |
| 5-Imino-L-norvaline                                       | C5 H10 N2 O2  | 130.0742 | 131.0815 |
| O-propenoyl-D-carnitine                                   | C10 H17 N O4  | 215.1157 | 216.1229 |
|                                                           |               | 178.8954 | 220.9293 |
|                                                           |               | 258.9082 | 259.9154 |
|                                                           |               | 235.901  | 236.9083 |
|                                                           |               | 311.8527 | 312.86   |
|                                                           |               | 236.9173 | 237.9246 |
|                                                           |               | 104.4848 | 105.4921 |
|                                                           |               | 151.8996 | 152.9067 |

|                    |                  |          |          |
|--------------------|------------------|----------|----------|
| Clomazone          | C12 H14 Cl N O2  | 239.0712 | 240.0785 |
|                    |                  | 231.0181 | 116.5163 |
| Furfural           | C5 H4 O2         | 96.02117 | 97.02844 |
|                    |                  | 279.9382 | 280.9455 |
|                    |                  | 180.8957 | 222.9295 |
| propionylcarnitine | C10 H19 N O4     | 217.1313 | 218.1386 |
|                    | C2 H5 N3 O6      | 167.0181 | 168.0253 |
|                    |                  | 240.932  | 241.9393 |
|                    |                  | 253.9638 | 127.9892 |
|                    |                  | 159.9796 | 160.9869 |
|                    |                  | 153.1113 | 154.1186 |
|                    |                  | 134.4817 | 135.4889 |
| QV1MVO1R           | C10 H11 N O4     | 209.0687 | 210.0759 |
|                    |                  | 261.9055 | 262.9128 |
| Methyldopa         | C10 H13 N O4     | 211.0844 | 212.0917 |
|                    |                  | 294.1425 | 295.1498 |
|                    |                  | 121.9172 | 122.9245 |
|                    | C21 H42 N3 O P S | 415.2778 | 416.2851 |
|                    |                  | 255.8913 | 256.8985 |
|                    |                  | 138.4899 | 139.4971 |
|                    |                  | 207.9543 | 208.9616 |
| 1-Indolizidinone   | C8 H13 N O       | 139.0996 | 140.1069 |
|                    |                  | 221.9221 | 222.9293 |
|                    |                  | 196.9936 | 198.0009 |
|                    |                  | 127.4843 | 128.4916 |
|                    |                  | 333.8681 | 334.8754 |
| methyprylon        | C10 H17 N O2     | 183.1258 | 184.1331 |
|                    |                  | 128.9854 | 129.9922 |
| 1640340            | C10 H17 N O3     | 199.1208 | 200.1281 |

Table A1. Down-regulated species from Figure 10, i.e. species significant to Reduced activity samples against Reference period samples

| Predicted Compound | Predicted Formula | Calculated MW | m/z      |
|--------------------|-------------------|---------------|----------|
| Phosphoric acid    | H3 O4 P           | 97.97694      | 98.98421 |
|                    |                   | 466.7934      | 467.8007 |
| Choline            | C5 H13 N O        | 103.0997      | 104.107  |
|                    |                   | 466.7937      | 467.8009 |
|                    |                   | 511.8148      | 494.8113 |
|                    |                   | 448.783       | 490.8168 |

|               |                 |          |          |
|---------------|-----------------|----------|----------|
|               | C7 H10 N3 O P   | 183.0565 | 184.0637 |
|               |                 | 489.8096 | 490.8169 |
|               |                 | 494.7884 | 495.7956 |
| SL3675000     | C18 H30 O       | 262.2295 | 280.2634 |
|               | C6 H4 N10       | 216.0623 | 217.0695 |
|               | C11 H2 N O8 P S | 338.9239 | 170.4693 |
| Linoleamide   | C18 H33 N O     | 279.2561 | 280.2633 |
|               |                 | 219.8583 | 220.8656 |
|               |                 | 203.9595 | 204.9667 |
|               |                 | 227.9243 | 494.8113 |
|               |                 | 293.8585 | 316.8477 |
|               |                 | 493.8041 | 494.8114 |
|               |                 | 466.7938 | 467.8011 |
|               |                 | 493.804  | 494.8113 |
|               |                 | 494.7885 | 495.7958 |
|               |                 | 235.1603 | 236.1676 |
| Chloropicrin  | C Cl3 N O2      | 162.8998 | 163.9071 |
|               |                 | 119.0946 | 120.1019 |
|               |                 | 466.7935 | 467.8008 |
| cyclohexenone | C6 H8 O         | 96.05754 | 138.0913 |
|               |                 | 222.0788 | 223.086  |
|               |                 | 297.8974 | 149.956  |
|               |                 | 466.7936 | 467.8009 |
|               |                 | 466.7935 | 467.8008 |
|               |                 | 288.1613 | 289.1686 |
|               |                 | 493.8037 | 494.811  |
|               |                 | 466.7934 | 467.8007 |
|               |                 | 414.8249 | 208.4197 |
|               |                 | 489.8095 | 490.8167 |
|               |                 | 265.8754 | 266.8835 |
|               |                 | 466.7935 | 467.8008 |
|               |                 | 466.794  | 467.8013 |
|               |                 | 464.7985 | 465.8058 |
|               |                 | 509.8057 | 510.813  |
|               |                 | 489.8097 | 490.817  |
| BX2625000     | C6 H5 Cl2 N     | 160.9798 | 161.9871 |
|               |                 | 347.9385 | 174.9765 |
|               |                 | 93.49661 | 94.50394 |
|               |                 | 193.9306 | 194.9379 |
|               |                 | 136.0115 | 178.0453 |
|               |                 | 200.9853 | 201.9926 |
|               |                 | 494.7885 | 495.7958 |
|               |                 | 494.7884 | 495.7957 |

|                    |             |          |          |
|--------------------|-------------|----------|----------|
|                    |             | 489.8093 | 490.8166 |
|                    |             | 120.9507 | 121.9579 |
|                    |             | 494.7884 | 495.7957 |
|                    |             | 493.8039 | 494.8111 |
|                    |             | 494.7882 | 495.7954 |
| D-PANTOTHENIC ACID | C9 H17 N O5 | 219.1106 | 220.1178 |
|                    |             | 126.0924 | 127.0997 |
|                    |             | 296.9562 | 297.9634 |

Table A2. Up-regulated species from Figure 10, i.e. species significant to Reference activity samples against Reduced period samples

| Predicted Compound                                                                                                | Predicted Formula | Calculated MW | m/z      |
|-------------------------------------------------------------------------------------------------------------------|-------------------|---------------|----------|
| Phosphoric acid                                                                                                   | H3 O4 P           | 97.97694      | 98.98421 |
|                                                                                                                   |                   | 466.7934      | 467.8007 |
|                                                                                                                   |                   | 466.7936      | 467.8009 |
|                                                                                                                   | C5 H2 N2 O4 S     | 185.9736      | 186.9808 |
|                                                                                                                   |                   | 538.1212      | 561.1104 |
|                                                                                                                   |                   | 120.9589      | 121.9662 |
|                                                                                                                   |                   | 466.7933      | 467.8006 |
| Choline                                                                                                           | C5 H13 N O        | 103.0997      | 104.107  |
|                                                                                                                   |                   | 466.7937      | 467.8009 |
|                                                                                                                   |                   | 511.8148      | 494.8113 |
|                                                                                                                   |                   | 448.783       | 490.8168 |
|                                                                                                                   | C7 H10 N3 O P     | 183.0565      | 184.0637 |
| 4,5-dihydroxy-6-(hydroxymethyl)-2-[2,4,6-trihydroxy-3-(4-hydroxybenzoyl)phenyl]oxan-3-yl 3,4,5-trihydroxybenzoate | C26 H24 O14       | 560.1031      | 561.1104 |
|                                                                                                                   |                   | 489.8099      | 490.8172 |
|                                                                                                                   |                   | 489.8096      | 490.8169 |
|                                                                                                                   | C24 H31 N O2 S    | 397.2074      | 398.2147 |
|                                                                                                                   |                   | 200.9853      | 201.9926 |
|                                                                                                                   |                   | 494.7887      | 495.796  |
|                                                                                                                   |                   | 494.7884      | 495.7956 |
| D-Carnitine                                                                                                       | C7 H15 N O3       | 161.1051      | 162.1124 |
|                                                                                                                   | C10 H21 N O5      | 235.1418      | 236.1491 |
|                                                                                                                   |                   | 473.3409      | 474.3482 |
|                                                                                                                   | C11 H2 N O8 P S   | 338.9239      | 170.4693 |
|                                                                                                                   |                   | 219.8583      | 220.8656 |
|                                                                                                                   |                   | 203.9595      | 204.9667 |
|                                                                                                                   |                   | 227.9243      | 494.8113 |

|                                        |                 |          |          |
|----------------------------------------|-----------------|----------|----------|
|                                        |                 | 293.8585 | 316.8477 |
|                                        | C11 H2 N O8 P S | 338.924  | 170.4693 |
|                                        |                 | 466.7938 | 467.8011 |
|                                        |                 | 493.804  | 494.8113 |
|                                        |                 | 494.7885 | 495.7958 |
|                                        |                 | 235.1603 | 236.1676 |
|                                        |                 | 564.7262 | 283.3704 |
|                                        | C8 H5 N6 O3 P   | 264.0157 | 265.023  |
|                                        |                 | 635.1226 | 636.1298 |
|                                        | C7 H15 N O4 S   | 209.0721 | 210.0793 |
| Chloropicrin                           | C Cl3 N O2      | 162.8998 | 163.9071 |
|                                        | C4 H N3 O7 S    | 234.954  | 235.9613 |
|                                        |                 | 119.0946 | 120.1019 |
|                                        |                 | 466.7935 | 467.8008 |
| cyclohexenone                          | C6 H8 O         | 96.05754 | 138.0913 |
|                                        |                 | 297.8974 | 149.956  |
|                                        |                 | 466.7936 | 467.8009 |
|                                        |                 | 466.7935 | 467.8008 |
|                                        | C7 H7 N3 O6 S   | 261.006  | 262.0133 |
|                                        |                 | 466.7934 | 467.8007 |
|                                        |                 | 414.8249 | 208.4197 |
| L-alpha-Glycerylphosphorylcholine      | C8 H20 N O6 P   | 257.1027 | 258.11   |
|                                        |                 | 489.8095 | 490.8167 |
|                                        |                 | 265.8754 | 266.8835 |
|                                        |                 | 466.7935 | 467.8008 |
|                                        |                 | 466.794  | 467.8013 |
|                                        | C8 H2 N3 O P    | 186.9933 | 94.50393 |
| L-(+)-Leucine                          | C6 H13 N O2     | 131.0946 | 132.1019 |
|                                        |                 | 464.7985 | 465.8058 |
|                                        |                 | 489.8097 | 490.817  |
| 2-(4-Methylthiazol-5-yl)ethyl butyrate | C10 H15 N O2 S  | 213.0822 | 214.0895 |
|                                        |                 | 93.49661 | 94.50394 |
|                                        | C5 H7 N6 O9 P   | 326.0006 | 327.0078 |
|                                        |                 | 136.0115 | 178.0453 |
|                                        |                 | 184.9932 | 93.50388 |
| Hopantenic acid                        | C10 H19 N O5    | 233.1262 | 234.1335 |
|                                        |                 | 200.9853 | 201.9926 |
|                                        |                 | 466.7935 | 467.8008 |
|                                        |                 | 494.7885 | 495.7958 |
| Benzophenone                           | C13 H10 O       | 182.0731 | 183.0803 |
|                                        |                 | 494.7884 | 495.7957 |
|                                        |                 | 489.8093 | 490.8166 |
|                                        |                 | 175.9996 | 177.0069 |

|                    |             |          |          |
|--------------------|-------------|----------|----------|
|                    |             | 149.4489 | 150.4562 |
|                    |             | 120.9507 | 121.9579 |
|                    |             | 494.7884 | 495.7957 |
|                    |             | 493.8039 | 494.8111 |
|                    |             | 371.2516 | 372.2588 |
|                    |             | 207.9825 | 208.9897 |
|                    |             | 234.954  | 235.9612 |
| g-Butyrobetaine    | C7 H15 N O2 | 145.1102 | 146.1175 |
|                    |             | 355.2568 | 356.264  |
|                    |             | 494.7882 | 495.7954 |
| D-PANTOTHENIC ACID | C9 H17 N O5 | 219.1106 | 220.1178 |
|                    |             | 341.2411 | 342.2483 |
|                    |             | 297.2149 | 298.2222 |
|                    |             | 102.9483 | 103.9556 |
|                    |             | 296.9562 | 297.9634 |
| 4-Nitrosobiphenyl  | C12 H9 N O  | 183.0683 | 184.0756 |
|                    |             | 236.1452 | 237.1525 |

Table A3. Up-regulated species from Figure 11, i.e. species significant to Reference activity samples against Post-baseline period samples

| Predicted Compound                                                                                                     | Predicted Formula | Calculated MW | m/z      |
|------------------------------------------------------------------------------------------------------------------------|-------------------|---------------|----------|
|                                                                                                                        | C44 H70 N O4 P    | 707.504       | 708.5113 |
|                                                                                                                        | C9 H19 N O        | 157.1466      | 158.1539 |
|                                                                                                                        | C39 H61 N2 O6 P   | 684.428       | 685.4353 |
|                                                                                                                        |                   | 217.9427      | 109.9786 |
|                                                                                                                        | C20 H39 N O7      | 405.2724      | 406.2797 |
| THIOQUINOX                                                                                                             | C9 H4 N2 S3       | 235.9532      | 118.9839 |
|                                                                                                                        | C10 H N3 O4 S     | 258.9691      | 130.4918 |
|                                                                                                                        | C36 H63 N5 S      | 597.4815      | 598.4887 |
|                                                                                                                        | C18 H32 O7        | 360.2146      | 361.222  |
|                                                                                                                        | C40 H65 N2 O P S2 | 684.4282      | 685.4354 |
| 5-(1,4-Dihydroxycyclohexyl)-1,2-dihydroxy-3-[(2E,4E,6E,8R,10R)-6,8,10-trimethyl-2,4,6-dodecatrienoyl]-4(1H)-pyridinone | C26 H37 N O6      | 459.2618      | 460.269  |
|                                                                                                                        |                   | 176.9679      | 159.9646 |
|                                                                                                                        |                   | 181.895       | 223.9288 |
| Phenethylamine                                                                                                         | C8 H11 N          | 121.0891      | 122.0964 |
|                                                                                                                        | C8 H7 O4 P        | 198.0079      | 100.0112 |

|                                                                                              |                  |          |          |
|----------------------------------------------------------------------------------------------|------------------|----------|----------|
| 7-(1-Ethoxyethoxy)-4,10-dimethyl-3,5,9,11-tetraoxatridecane                                  | C15 H32 O6       | 308.2196 | 309.2269 |
|                                                                                              | C8 H7 O4 P       | 198.0079 | 100.0112 |
| N-{4-[(2R,3R)-3-(Hydroxymethyl)-4-isobutyl-5-oxo-2-morpholinyl]phenyl}cyclobutanecarboxamide | C20 H28 N2 O4    | 382.1965 | 383.2038 |
| Methyl palmitate                                                                             | C17 H34 O2       | 287.2822 | 288.2895 |
|                                                                                              | C19 H45 N8 O3 P  | 464.3345 | 465.3418 |
|                                                                                              |                  | 253.9418 | 254.9491 |
|                                                                                              | C21 H44 O8       | 424.3033 | 447.2925 |
|                                                                                              | C21 H42 O7       | 406.2927 | 424.3266 |
|                                                                                              |                  | 117.9765 | 118.9839 |
|                                                                                              |                  | 172.421  | 173.4282 |
|                                                                                              | C28 H66 N9 O6 P  | 655.4868 | 656.4941 |
|                                                                                              | C5 H2 N5 O P     | 178.9995 | 90.50701 |
|                                                                                              | C8 H7 O4 P       | 198.0079 | 100.0112 |
|                                                                                              | C30 H58 N3 O P S | 539.4029 | 540.4102 |
|                                                                                              | C24 H51 N O8     | 481.3611 | 482.3684 |
| (2E)-2-Bromo-4-oxo-2-hexenedioic acid                                                        | C6 H5 Br O5      | 235.9312 | 236.9385 |
|                                                                                              |                  | 441.3297 | 442.337  |
|                                                                                              | C12 H26 O5       | 250.1779 | 251.1852 |
|                                                                                              | C32 H76 N10 O11  | 776.5689 | 777.5762 |
|                                                                                              | C22 H51 N8 O4 P  | 522.3763 | 523.3836 |
|                                                                                              |                  | 169.9503 | 170.9576 |
|                                                                                              | C24 H50 O9       | 482.3451 | 500.3789 |
|                                                                                              |                  | 89.49972 | 90.507   |
|                                                                                              |                  | 353.2775 | 354.2848 |
|                                                                                              | C18 H38 O7       | 366.2615 | 367.2687 |
| Bis(4-ethylbenzylidene)sorbitol                                                              | C24 H30 O6       | 414.2039 | 415.2112 |
|                                                                                              | C39 H64 O6 S     | 660.4421 | 661.4494 |
|                                                                                              |                  | 156.9812 | 100.0112 |
| Methyl palmitate                                                                             | C17 H34 O2       | 287.2822 | 288.2895 |
|                                                                                              | C30 H66 N6 O4 S2 | 638.4598 | 656.4937 |
|                                                                                              | C22 H53 N8 O5 P  | 540.3868 | 541.3942 |
|                                                                                              | C3 H4 N3 O9 P    | 256.9686 | 129.4915 |
|                                                                                              |                  | 227.9368 | 135.489  |
|                                                                                              |                  | 147.0201 | 185.9833 |
|                                                                                              |                  | 115.9546 | 116.9619 |
|                                                                                              |                  | 157.0606 | 158.0679 |
|                                                                                              | C27 H52 N10 O4   | 580.4181 | 598.4519 |
|                                                                                              |                  | 153.9001 | 154.9074 |
|                                                                                              | C16 H37 N8 P     | 372.2873 | 373.2945 |
| Glycerol 5-hydroxydodecanoate                                                                | C15 H30 O5       | 290.2092 | 291.2164 |

|                                                                                 |                   |          |          |
|---------------------------------------------------------------------------------|-------------------|----------|----------|
|                                                                                 | C8 H5 O3 P        | 179.9973 | 91.00593 |
|                                                                                 | C30 H60 N3 O2 P S | 557.4134 | 558.4207 |
|                                                                                 |                   | 171.0597 | 172.067  |
|                                                                                 |                   | 143.9495 | 185.9833 |
| tranexamic acid                                                                 | C8 H15 N O2       | 157.1102 | 158.1175 |
|                                                                                 |                   | 208.9696 | 105.4921 |
|                                                                                 |                   | 295.2357 | 296.2429 |
|                                                                                 |                   | 108.4717 | 109.4789 |
|                                                                                 |                   | 588.3844 | 589.3917 |
|                                                                                 |                   | 115.9547 | 116.962  |
|                                                                                 |                   | 143.9495 | 185.9833 |
|                                                                                 |                   | 383.2881 | 384.2954 |
|                                                                                 | C19 H38 N6 O6     | 446.2851 | 447.2924 |
|                                                                                 | C25 H48 N6 O7     | 544.3584 | 545.3657 |
|                                                                                 | C3 H2 O9 S        | 213.942  | 107.9783 |
|                                                                                 |                   | 554.4587 | 555.4659 |
|                                                                                 | C15 H33 N O       | 243.2561 | 244.2634 |
|                                                                                 | C30 H46 O3 S      | 486.3165 | 487.3237 |
|                                                                                 | C18 H36 O6        | 348.251  | 349.2582 |
|                                                                                 |                   | 106.4687 | 89.46536 |
|                                                                                 |                   | 598.4847 | 599.4919 |
|                                                                                 | C15 H33 N O       | 243.2561 | 244.2634 |
|                                                                                 | C7 H2 N3 O6 P     | 254.9683 | 128.4914 |
|                                                                                 | C28 H58 N10 S2    | 598.4286 | 599.4359 |
|                                                                                 |                   | 268.9634 | 135.489  |
|                                                                                 |                   | 411.3192 | 412.3265 |
|                                                                                 |                   | 200.9683 | 201.9756 |
| benzyl N-(1-[[[(3,4-dimethoxyphenethyl)amino]carbonyl]-2-methylpropyl]carbamate | C23 H30 N2 O5     | 431.2304 | 432.2377 |
| NP-020014                                                                       | C15 H26 O3        | 254.188  | 255.1953 |
|                                                                                 |                   | 97.46336 | 98.47065 |
|                                                                                 |                   | 381.197  | 382.2042 |
|                                                                                 | C21 H43 N4 O2 P S | 446.2852 | 447.2925 |
|                                                                                 | C16 H30 N6 O4     | 370.2329 | 371.2402 |
|                                                                                 | C25 H60 N9 O5 P   | 597.4445 | 598.4518 |
| AJ4900000                                                                       | C2 H4 O5 S        | 139.9782 | 162.9673 |
| 13-oxotrideca-9,11-dienoic acid                                                 | C13 H20 O3        | 224.1411 | 225.1484 |
| Methyl palmitate                                                                | C17 H34 O2        | 287.2823 | 288.2895 |
|                                                                                 |                   | 212.9373 | 107.4759 |
|                                                                                 | C25 H62 N9 O6 P   | 615.4553 | 616.4625 |
|                                                                                 |                   | 275.8894 | 276.8966 |
|                                                                                 |                   | 339.9244 | 340.9317 |

|                         |                 |          |          |
|-------------------------|-----------------|----------|----------|
|                         |                 | 117.4769 | 118.4842 |
|                         | C18 H39 N O6    | 365.2775 | 366.2848 |
|                         |                 | 179.8943 | 180.9016 |
|                         |                 | 344.838  | 173.4263 |
|                         | C17 H37 N O5    | 335.267  | 336.2742 |
|                         | C21 H45 N O8    | 439.3142 | 440.3215 |
|                         |                 | 184.976  | 185.9833 |
|                         |                 | 98.52392 | 99.53119 |
|                         |                 | 482.3645 | 483.3718 |
|                         |                 | 383.288  | 384.2953 |
|                         | C12 H27 N       | 185.2143 | 186.2216 |
|                         |                 | 126.9818 | 127.9891 |
|                         | C4 H9 N8 O5 P   | 280.0436 | 281.0508 |
|                         | C26 H52 N3 P S  | 469.361  | 470.3683 |
|                         |                 | 255.9696 | 128.9921 |
|                         |                 | 356.1398 | 357.1471 |
|                         | C3 H4 O10 S     | 231.9526 | 116.9836 |
|                         |                 | 232.9537 | 117.4841 |
| Diethanolamine          | C4 H11 N O2     | 105.079  | 106.0863 |
|                         |                 | 133.9652 | 116.9619 |
| dihydromethanophenazine | C37 H52 N2 O    | 540.4061 | 541.4133 |
|                         | C28 H49 N6 P    | 500.375  | 501.3822 |
|                         |                 | 220.9209 | 221.9282 |
|                         | C28 H51 N8 P S  | 562.3689 | 563.3762 |
|                         | C38 H67 N5 O3 S | 673.4967 | 674.504  |
|                         |                 | 344.84   | 173.4273 |
|                         | C14 H28 N8 O6 S | 436.1859 | 437.1932 |
|                         | C23 H49 N O7    | 451.3508 | 452.3581 |
|                         |                 | 113.4901 | 114.4974 |
|                         |                 | 482.3645 | 483.3718 |
|                         |                 | 598.4479 | 599.4552 |
|                         | C10 H23 N7 O6   | 337.1714 | 338.1786 |
|                         | C17 H35 N O2    | 285.2666 | 286.2739 |
|                         |                 | 206.9779 | 207.9851 |
|                         | C18 H39 N O7    | 381.2724 | 382.2797 |
|                         |                 | 218.9211 | 219.9284 |
|                         |                 | 122.9331 | 263.8993 |
|                         |                 | 177.8942 | 178.9015 |
|                         |                 | 262.8921 | 263.8994 |
|                         | C16 H24 N P     | 261.1647 | 262.172  |
|                         | C30 H59 N2 O5 P | 558.4169 | 559.4242 |
|                         | C24 H34 O2 S    | 386.2278 | 387.2351 |
|                         | C5 H7 N9 O9     | 337.0373 | 338.0446 |

|                                          |                  |          |          |
|------------------------------------------|------------------|----------|----------|
|                                          | C27 H58 N2 O12   | 602.3998 | 603.4071 |
|                                          | C29 H47 N5 S     | 497.3561 | 498.3634 |
|                                          | C16 H33 N O2     | 271.251  | 272.2582 |
|                                          | C13 H24 N6 O4    | 328.186  | 329.1932 |
|                                          |                  | 178.8954 | 220.9293 |
|                                          |                  | 161.96   | 144.9568 |
|                                          |                  | 266.9627 | 134.4886 |
|                                          |                  | 311.8527 | 312.86   |
|                                          |                  | 236.9173 | 237.9246 |
|                                          | C14 H31 N O4     | 277.2252 | 278.2324 |
|                                          | C24 H60 N10 O8   | 616.4584 | 617.4657 |
|                                          | C22 H54 N9 O5 P  | 555.3977 | 556.405  |
|                                          | C17 H37 N O6     | 351.2619 | 352.2692 |
|                                          |                  | 104.4848 | 105.4921 |
|                                          |                  | 151.8996 | 152.9067 |
|                                          | C28 H56 N6 O9    | 620.4103 | 621.4176 |
|                                          |                  | 380.8618 | 381.869  |
|                                          |                  | 309.9054 | 310.9127 |
|                                          |                  | 233.9526 | 117.9836 |
|                                          |                  | 231.0181 | 116.5163 |
|                                          |                  | 189.9914 | 116.5163 |
|                                          |                  | 279.9382 | 280.9455 |
|                                          |                  | 174.9472 | 175.9545 |
|                                          | C39 H61 N5 O2 S  | 663.4551 | 664.4623 |
|                                          |                  | 367.265  | 368.2723 |
|                                          |                  | 180.8957 | 222.9295 |
|                                          |                  | 393.3088 | 394.316  |
|                                          |                  | 240.932  | 241.9393 |
|                                          |                  | 253.9638 | 127.9892 |
|                                          | C29 H58 N3 O P S | 527.4028 | 528.4101 |
|                                          |                  | 429.2782 | 430.2855 |
|                                          |                  | 407.9118 | 408.919  |
|                                          |                  | 94.99574 | 96.00304 |
| 6,8-Dimethyl-6,7,8,9-tetradhydroergoline | C16 H17 N2       | 237.1382 | 238.1455 |
|                                          |                  | 153.1113 | 154.1186 |
|                                          |                  | 134.4817 | 135.4889 |
|                                          | C28 H45 N5 S     | 483.3403 | 484.3476 |
| 4232620                                  | C14 H28 O6       | 292.1884 | 293.1956 |
|                                          | C21 H40 N10 O2   | 464.3342 | 465.3415 |
|                                          | C30 H61 N O10    | 595.4292 | 596.4365 |
|                                          |                  | 354.2808 | 355.2881 |
|                                          |                  | 122.9737 | 123.981  |

|                                         |                   |          |          |
|-----------------------------------------|-------------------|----------|----------|
|                                         | C42 H69 N9 S      | 731.5391 | 732.5464 |
|                                         |                   | 367.2649 | 368.2722 |
|                                         |                   | 312.8744 | 313.8817 |
|                                         | C21 H44 O8        | 424.3034 | 425.3107 |
|                                         | C13 H29 N4 O2 P S | 336.1749 | 337.1822 |
|                                         | C20 H50 N9 O3 P   | 495.3763 | 496.3836 |
|                                         | C19 H36 N6 O6     | 444.2696 | 445.2769 |
|                                         | C23 H44 N3 P S    | 425.2987 | 426.306  |
|                                         | C34 H47 N3 O3     | 545.3618 | 546.3691 |
|                                         | C10 H20 N6 O3     | 272.16   | 273.1672 |
|                                         | C15 H33 N O6      | 323.2306 | 324.2379 |
|                                         | C22 H47 N O9      | 469.3246 | 470.3319 |
|                                         |                   | 138.4899 | 139.4971 |
|                                         |                   | 354.2809 | 355.2882 |
|                                         |                   | 207.9543 | 208.9616 |
| 1-Indolizidinone                        | C8 H13 N O        | 139.0996 | 140.1069 |
|                                         |                   | 221.9221 | 222.9293 |
|                                         |                   | 196.9936 | 198.0009 |
|                                         |                   | 127.4843 | 128.4916 |
|                                         | C24 H47 N4 O3 P S | 502.3116 | 503.3189 |
|                                         | C32 H64 N3 O2 P S | 585.4447 | 586.452  |
|                                         | C41 H70 N3 O3 P   | 683.5167 | 684.5239 |
|                                         | C29 H58 N4 O4 S   | 558.4169 | 559.4242 |
|                                         | C10 H18 N6 O2     | 254.1493 | 255.1566 |
|                                         | C41 H63 N2 O4 P   | 678.4528 | 679.46   |
| (2E,6Z)-N-Cyclopropyl-2,6-nonadienamide | C12 H19 N O       | 193.1465 | 194.1538 |
|                                         | C31 H62 N6 O10    | 678.4519 | 679.4592 |
|                                         | C21 H52 N9 O3 P   | 509.3927 | 510.4    |
|                                         |                   | 500.3749 | 501.3822 |
|                                         |                   | 128.9854 | 129.9922 |
|                                         | C19 H41 N O8      | 411.2828 | 412.2901 |
|                                         | C16 H35 N O6      | 337.2462 | 338.2535 |
|                                         | C27 H55 N O9      | 537.3873 | 538.3946 |
|                                         |                   | 383.2882 | 384.2954 |
|                                         |                   | 479.3454 | 480.3527 |
|                                         | C23 H49 N O8      | 467.3454 | 468.3527 |
|                                         | C38 H67 N5 O3 S   | 673.4971 | 674.5043 |
|                                         | C21 H43 N O7      | 421.3038 | 422.311  |
|                                         | C10 H18 N6 O3     | 270.1443 | 271.1516 |
|                                         |                   | 527.3669 | 528.3742 |

Table A4. Down-regulated species from Figure 11, i.e. species significant to Post-baseline activity samples against Reference period samples

| Predicted Compound                                                                                                     | Predicted Formula | Calculated MW | m/z      |
|------------------------------------------------------------------------------------------------------------------------|-------------------|---------------|----------|
|                                                                                                                        | C44 H70 N O4 P    | 707.504       | 708.5113 |
|                                                                                                                        | C9 H19 N O        | 157.1466      | 158.1539 |
|                                                                                                                        | C39 H61 N2 O6 P   | 684.428       | 685.4353 |
| 5-Methoxybenzimidazole                                                                                                 | C8 H8 N2 O        | 148.0632      | 149.0704 |
| Medronic Acid                                                                                                          | C H6 O6 P2        | 175.9645      | 176.9718 |
|                                                                                                                        |                   | 158.9617      | 159.969  |
|                                                                                                                        | C40 H65 N2 O P S2 | 684.4282      | 685.4354 |
|                                                                                                                        | C42 H66 N O4 P    | 679.4727      | 680.4799 |
| 5-(1,4-Dihydroxycyclohexyl)-1,2-dihydroxy-3-[(2E,4E,6E,8R,10R)-6,8,10-trimethyl-2,4,6-dodecatrienoyl]-4(1H)-pyridinone | C26 H37 N O6      | 459.2618      | 460.269  |
|                                                                                                                        |                   | 99.05589      | 100.0632 |
| 7-(1-Ethoxyethoxy)-4,10-dimethyl-3,5,9,11-tetraoxatridecane                                                            | C15 H32 O6        | 308.2196      | 309.2269 |
| Medronic Acid                                                                                                          | C H6 O6 P2        | 175.9645      | 176.9718 |
|                                                                                                                        | C8 H7 O4 P        | 198.0079      | 100.0112 |
| Methyl palmitate                                                                                                       | C17 H34 O2        | 287.2822      | 288.2895 |
|                                                                                                                        | C19 H45 N8 O3 P   | 464.3345      | 465.3418 |
|                                                                                                                        |                   | 253.9418      | 254.9491 |
|                                                                                                                        | C21 H44 O8        | 424.3033      | 447.2925 |
|                                                                                                                        | C21 H42 O7        | 406.2927      | 424.3266 |
|                                                                                                                        |                   | 172.421       | 173.4282 |
|                                                                                                                        | C28 H66 N9 O6 P   | 655.4868      | 656.4941 |
|                                                                                                                        | C30 H58 N3 O P S  | 539.4029      | 540.4102 |
|                                                                                                                        | C24 H51 N O8      | 481.3611      | 482.3684 |
|                                                                                                                        |                   | 441.3297      | 442.337  |
|                                                                                                                        | C12 H26 O5        | 250.1779      | 251.1852 |
|                                                                                                                        | C22 H51 N8 O4 P   | 522.3763      | 523.3836 |
|                                                                                                                        | C24 H50 O9        | 482.3451      | 500.3789 |
|                                                                                                                        |                   | 353.2775      | 354.2848 |
|                                                                                                                        | C18 H38 O7        | 366.2615      | 367.2687 |
|                                                                                                                        |                   | 136.98        | 159.969  |
| Bis(4-ethylbenzylidene)sorbitol                                                                                        | C24 H30 O6        | 414.2039      | 415.2112 |
|                                                                                                                        | C39 H64 O6 S      | 660.4421      | 661.4494 |
|                                                                                                                        |                   | 156.9812      | 100.0112 |
| Methyl palmitate                                                                                                       | C17 H34 O2        | 287.2822      | 288.2895 |
|                                                                                                                        | C30 H66 N6 O4 S2  | 638.4598      | 656.4937 |
|                                                                                                                        | C22 H53 N8 O5 P   | 540.3868      | 541.3942 |

|                                                                               |                   |          |          |
|-------------------------------------------------------------------------------|-------------------|----------|----------|
| Linoleamide                                                                   | C18 H33 N O       | 279.2561 | 280.2633 |
|                                                                               |                   | 157.0606 | 158.0679 |
|                                                                               | C27 H52 N10 O4    | 580.4181 | 598.4519 |
| Glycerol 5-hydroxydodecanoate                                                 | C15 H30 O5        | 290.2092 | 291.2164 |
|                                                                               | C3 H N2 O3 P S    | 175.9448 | 176.9521 |
|                                                                               | C30 H60 N3 O2 P S | 557.4134 | 558.4207 |
|                                                                               |                   | 295.2357 | 296.2429 |
|                                                                               |                   | 143.9495 | 185.9833 |
|                                                                               |                   | 383.2881 | 384.2954 |
|                                                                               | C19 H38 N6 O6     | 446.2851 | 447.2924 |
|                                                                               | C25 H48 N6 O7     | 544.3584 | 545.3657 |
|                                                                               | C15 H33 N O       | 243.2561 | 244.2634 |
|                                                                               | C30 H46 O3 S      | 486.3165 | 487.3237 |
|                                                                               | C18 H36 O6        | 348.251  | 349.2582 |
|                                                                               | C15 H33 N O       | 243.2561 | 244.2634 |
|                                                                               | C28 H58 N10 S2    | 598.4286 | 599.4359 |
|                                                                               |                   | 411.3192 | 412.3265 |
| benzyl N-(1-[(3,4-dimethoxyphenethyl)amino]carbonyl)-2-methylpropyl)carbamate | C23 H30 N2 O5     | 431.2304 | 432.2377 |
|                                                                               | C21 H43 N4 O2 P S | 446.2852 | 447.2925 |
|                                                                               | C16 H30 N6 O4     | 370.2329 | 371.2402 |
|                                                                               | C25 H60 N9 O5 P   | 597.4445 | 598.4518 |
| AJ4900000                                                                     | C2 H4 O5 S        | 139.9782 | 162.9673 |
| 13-oxotrideca-9,11-dienoic acid                                               | C13 H20 O3        | 224.1411 | 225.1484 |
| Methyl palmitate                                                              | C17 H34 O2        | 287.2823 | 288.2895 |
|                                                                               | C25 H62 N9 O6 P   | 615.4553 | 616.4625 |
|                                                                               |                   | 275.8894 | 276.8966 |
|                                                                               |                   | 119.0162 | 161.05   |
|                                                                               | C18 H39 N O6      | 365.2775 | 366.2848 |
|                                                                               | C17 H37 N O5      | 335.267  | 336.2742 |
|                                                                               | C33 H66 N O2 P S  | 571.4556 | 572.4629 |
|                                                                               | C21 H45 N O8      | 439.3142 | 440.3215 |
|                                                                               |                   | 482.3645 | 483.3718 |
|                                                                               |                   | 383.288  | 384.2953 |
|                                                                               | C26 H52 N3 P S    | 469.361  | 470.3683 |
| Diethanolamine                                                                | C4 H11 N O2       | 105.079  | 106.0863 |
| dihydromethanophenazine                                                       | C37 H52 N2 O      | 540.4061 | 541.4133 |
|                                                                               | C28 H49 N6 P      | 500.375  | 501.3822 |
|                                                                               | C28 H51 N8 P S    | 562.3689 | 563.3762 |
|                                                                               | C38 H67 N5 O3 S   | 673.4967 | 674.504  |
|                                                                               | C14 H28 N8 O6 S   | 436.1859 | 437.1932 |
|                                                                               | C23 H49 N O7      | 451.3508 | 452.3581 |

|                                         |                   |          |          |
|-----------------------------------------|-------------------|----------|----------|
|                                         |                   | 482.3645 | 483.3718 |
|                                         |                   | 598.4479 | 599.4552 |
|                                         | C17 H35 N O2      | 285.2666 | 286.2739 |
|                                         | C18 H39 N O7      | 381.2724 | 382.2797 |
|                                         | C14 H31 N O5      | 293.2201 | 294.2273 |
|                                         | C30 H59 N2 O5 P   | 558.4169 | 559.4242 |
|                                         | C24 H34 O2 S      | 386.2278 | 387.2351 |
|                                         | C27 H58 N2 O12    | 602.3998 | 603.4071 |
|                                         | C29 H47 N5 S      | 497.3561 | 498.3634 |
|                                         | C13 H24 N6 O4     | 328.186  | 329.1932 |
|                                         |                   | 161.96   | 144.9568 |
|                                         | C14 H31 N O4      | 277.2252 | 278.2324 |
|                                         | C24 H60 N10 O8    | 616.4584 | 617.4657 |
|                                         | C22 H54 N9 O5 P   | 555.3977 | 556.405  |
|                                         | C17 H37 N O6      | 351.2619 | 352.2692 |
|                                         | C28 H56 N6 O9     | 620.4103 | 621.4176 |
|                                         |                   | 233.9526 | 117.9836 |
|                                         |                   | 189.9914 | 116.5163 |
|                                         |                   | 174.9472 | 175.9545 |
|                                         |                   | 367.265  | 368.2723 |
|                                         |                   | 393.3088 | 394.316  |
|                                         | C29 H58 N3 O P S  | 527.4028 | 528.4101 |
|                                         |                   | 429.2782 | 430.2855 |
|                                         |                   | 94.99574 | 96.00304 |
| 6,8-Dimethyl-6,7,8,9-tetrahydroergoline | C16 H17 N2        | 237.1382 | 238.1455 |
|                                         | C28 H45 N5 S      | 483.3403 | 484.3476 |
| 4232620                                 | C14 H28 O6        | 292.1884 | 293.1956 |
|                                         | C21 H40 N10 O2    | 464.3342 | 465.3415 |
|                                         | C30 H61 N O10     | 595.4292 | 596.4365 |
|                                         |                   | 354.2808 | 355.2881 |
|                                         | C42 H69 N9 S      | 731.5391 | 732.5464 |
|                                         |                   | 367.2649 | 368.2722 |
|                                         | C21 H44 O8        | 424.3034 | 425.3107 |
|                                         | C13 H29 N4 O2 P S | 336.1749 | 337.1822 |
|                                         | C20 H50 N9 O3 P   | 495.3763 | 496.3836 |
|                                         | C19 H36 N6 O6     | 444.2696 | 445.2769 |
|                                         | C23 H44 N3 P S    | 425.2987 | 426.306  |
|                                         | C34 H47 N3 O3     | 545.3618 | 546.3691 |
|                                         | C10 H20 N6 O3     | 272.16   | 273.1672 |
|                                         | C15 H33 N O6      | 323.2306 | 324.2379 |
|                                         | C22 H47 N O9      | 469.3246 | 470.3319 |
|                                         |                   | 354.2809 | 355.2882 |

|  |                   |          |          |
|--|-------------------|----------|----------|
|  | C24 H47 N4 O3 P S | 502.3116 | 503.3189 |
|  | C32 H64 N3 O2 P S | 585.4447 | 586.452  |
|  | C29 H58 N4 O4 S   | 558.4169 | 559.4242 |
|  | C41 H63 N2 O4 P   | 678.4528 | 679.46   |
|  | C31 H62 N6 O10    | 678.4519 | 679.4592 |
|  | C21 H52 N9 O3 P   | 509.3927 | 510.4    |
|  |                   | 500.3749 | 501.3822 |
|  | C19 H41 N O8      | 411.2828 | 412.2901 |
|  | C16 H35 N O6      | 337.2462 | 338.2535 |
|  | C27 H55 N O9      | 537.3873 | 538.3946 |
|  |                   | 383.2882 | 384.2954 |
|  |                   | 479.3454 | 480.3527 |
|  | C23 H49 N O8      | 467.3454 | 468.3527 |
|  | C38 H67 N5 O3 S   | 673.4971 | 674.5043 |
|  | C21 H43 N O7      | 421.3038 | 422.311  |
|  | C10 H18 N6 O3     | 270.1443 | 271.1516 |
|  |                   | 527.3669 | 528.3742 |

Table A5. Up-regulated species from Figure 12, i.e. species significant to Post-baseline activity samples against Reduced period samples

| Predicted Compound                                                                                                | Predicted Formula | Calculated MW | m/z      |
|-------------------------------------------------------------------------------------------------------------------|-------------------|---------------|----------|
| Farnesylacetone                                                                                                   | C18 H30 O         | 262.2296      | 280.2634 |
|                                                                                                                   | C5 H2 N2 O4 S     | 185.9736      | 186.9808 |
| Acetyl-L-carnitine                                                                                                | C9 H17 N O4       | 203.1157      | 204.1229 |
| 4,5-dihydroxy-6-(hydroxymethyl)-2-[2,4,6-trihydroxy-3-(4-hydroxybenzoyl)phenyl]oxan-3-yl 3,4,5-trihydroxybenzoate | C26 H24 O14       | 560.1031      | 561.1104 |
| D-Carnitine                                                                                                       | C7 H15 N O3       | 161.1051      | 162.1124 |
| Amide C18                                                                                                         | C18 H37 N O       | 283.2874      | 284.2947 |
| Acetyl-L-carnitine                                                                                                | C9 H17 N O4       | 203.1156      | 204.1229 |
|                                                                                                                   | C7 H15 N O4 S     | 209.0721      | 210.0793 |
| Hydroxynorleucine                                                                                                 | C6 H13 N O3       | 147.0895      | 148.0968 |
| L-threo-3-Phenylserine                                                                                            | C9 H11 N O3       | 181.0738      | 182.0811 |
| norfenefrine                                                                                                      | C8 H11 N O2       | 153.0789      | 154.0862 |
| 2-((4-Nitrophenoxy)methyl)oxirane                                                                                 | C9 H9 N O4        | 195.053       | 196.0603 |
| L-(+)-Leucine                                                                                                     | C6 H13 N O2       | 131.0946      | 132.1019 |
| 5-Imino-L-norvaline                                                                                               | C5 H10 N2 O2      | 130.0742      | 131.0815 |
| 4-Aminophenol                                                                                                     | C6 H7 N O         | 109.0528      | 142.0862 |
| propionylcarnitine                                                                                                | C10 H19 N O4      | 217.1313      | 218.1386 |
| Benzophenone                                                                                                      | C13 H10 O         | 182.0731      | 183.0803 |

|                 |                     |          |          |
|-----------------|---------------------|----------|----------|
|                 |                     | 371.2516 | 372.2588 |
|                 |                     | 601.7593 | 301.8869 |
|                 | C21 H42 N3 O<br>P S | 415.2778 | 416.2851 |
| g-Butyrobetaine | C7 H15 N O2         | 145.1102 | 146.1175 |
|                 |                     | 355.2568 | 356.264  |
|                 |                     | 341.2411 | 342.2483 |
|                 |                     | 297.2149 | 298.2222 |

Table A6. Down-regulated species from Figure 11, i.e. species significant to Reduced activity samples against Post-baseline period samples

|                                                           | NH <sub>4</sub> <sup>+</sup> | NO <sub>2</sub> <sup>-</sup> | NO <sub>3</sub> <sup>-</sup> | DON    | Na <sup>+</sup> | K <sup>+</sup> | Ca <sup>2+</sup> | Mg <sup>2+</sup> | F <sup>-</sup> | C <sub>2</sub> H <sub>2</sub> O <sub>2</sub> <sup>-</sup> | H <sub>2</sub> CCOO <sup>-</sup> | HCOO <sup>-</sup> | Cl <sup>-</sup> | PO <sub>4</sub> <sup>3-</sup> | SO <sub>4</sub> <sup>2-</sup> | C <sub>2</sub> O <sub>4</sub> <sup>2-</sup> | DOC    | H/C    | O/C    | O/N    | O/S    | N/C    | DBE    | AI    |
|-----------------------------------------------------------|------------------------------|------------------------------|------------------------------|--------|-----------------|----------------|------------------|------------------|----------------|-----------------------------------------------------------|----------------------------------|-------------------|-----------------|-------------------------------|-------------------------------|---------------------------------------------|--------|--------|--------|--------|--------|--------|--------|-------|
| NH <sub>4</sub> <sup>+</sup>                              | 1.000                        |                              |                              |        |                 |                |                  |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| NO <sub>2</sub> <sup>-</sup>                              | 0.475                        | 1.000                        |                              |        |                 |                |                  |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| NO <sub>3</sub> <sup>-</sup>                              | 0.425                        | 0.000                        | 1.000                        |        |                 |                |                  |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| DON                                                       | 0.488                        | 0.248                        | 0.432                        | 1.000  |                 |                |                  |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| Na <sup>+</sup>                                           | -0.088                       | -0.046                       | 0.079                        | -0.035 | 1.000           |                |                  |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| K <sup>+</sup>                                            | 0.412                        | 0.197                        | 0.615                        | 0.352  | 0.702           | 1.000          |                  |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| Ca <sup>2+</sup>                                          | 0.204                        | 0.174                        | 0.120                        | 0.144  | 0.823           | 0.768          | 1.000            |                  |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| Mg <sup>2+</sup>                                          | 0.510                        | 0.137                        | 0.387                        | 0.252  | 0.618           | 0.858          | 0.845            | 1.000            |                |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| F <sup>-</sup>                                            | 0.108                        | -0.195                       | 0.883                        | 0.315  | 0.057           | 0.482          | -0.019           | 0.192            | 1.000          |                                                           |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| C <sub>2</sub> H <sub>2</sub> O <sub>2</sub> <sup>-</sup> | 0.510                        | 0.025                        | 0.902                        | 0.326  | 0.023           | 0.636          | 0.154            | 0.519            | 0.749          | 1.000                                                     |                                  |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| H <sub>2</sub> CCOO <sup>-</sup>                          | 0.236                        | 0.149                        | 0.867                        | 0.457  | -0.029          | 0.487          | -0.030           | 0.135            | 0.852          | 0.718                                                     | 1.000                            |                   |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| HCOO <sup>-</sup>                                         | 0.382                        | -0.113                       | 0.922                        | 0.359  | 0.063           | 0.637          | 0.114            | 0.482            | 0.836          | 0.963                                                     | 0.769                            | 1.000             |                 |                               |                               |                                             |        |        |        |        |        |        |        |       |
| Cl <sup>-</sup>                                           | 0.396                        | 0.016                        | 0.878                        | 0.345  | 0.425           | 0.819          | 0.483            | 0.623            | 0.732          | 0.830                                                     | 0.690                            | 0.811             | 1.000           |                               |                               |                                             |        |        |        |        |        |        |        |       |
| PO <sub>4</sub> <sup>3-</sup>                             | 0.152                        | 0.060                        | 0.641                        | 0.382  | 0.121           | 0.519          | 0.034            | 0.232            | 0.710          | 0.532                                                     | 0.654                            | 0.622             | 0.565           | 1.000                         |                               |                                             |        |        |        |        |        |        |        |       |
| SO <sub>4</sub> <sup>2-</sup>                             | 0.657                        | 0.138                        | 0.664                        | 0.327  | 0.049           | 0.629          | 0.269            | 0.695            | 0.446          | 0.880                                                     | 0.427                            | 0.825             | 0.640           | 0.334                         | 1.000                         |                                             |        |        |        |        |        |        |        |       |
| C <sub>2</sub> O <sub>4</sub> <sup>2-</sup>               | 0.168                        | -0.157                       | 0.854                        | 0.395  | 0.068           | 0.530          | 0.016            | 0.234            | 0.969          | 0.739                                                     | 0.838                            | 0.829             | 0.724           | 0.781                         | 0.463                         | 1.000                                       |        |        |        |        |        |        |        |       |
| DOC                                                       | 0.595                        | 0.181                        | 0.546                        | 0.537  | -0.268          | 0.162          | -0.099           | 0.040            | 0.332          | 0.453                                                     | 0.550                            | 0.372             | 0.385           | 0.190                         | 0.292                         | 0.332                                       | 1.000  |        |        |        |        |        |        |       |
| H/C                                                       | -0.433                       | -0.261                       | -0.703                       | -0.511 | -0.368          | -0.694         | -0.436           | -0.513           | -0.566         | -0.599                                                    | -0.632                           | -0.582            | -0.817          | -0.500                        | -0.477                        | -0.580                                      | -0.399 | 1.000  |        |        |        |        |        |       |
| O/C                                                       | 0.048                        | 0.272                        | -0.376                       | -0.230 | 0.043           | -0.160         | 0.008            | 0.006            | -0.468         | -0.251                                                    | -0.377                           | -0.316            | -0.226          | -0.365                        | -0.024                        | -0.457                                      | -0.402 | 0.058  | 1.000  |        |        |        |        |       |
| O/N                                                       | 0.141                        | 0.091                        | -0.177                       | -0.150 | 0.054           | -0.100         | -0.059           | 0.020            | -0.308         | -0.175                                                    | -0.216                           | -0.178            | -0.117          | -0.075                        | -0.024                        | -0.274                                      | -0.191 | 0.015  | 0.686  | 1.000  |        |        |        |       |
| O/S                                                       | 0.256                        | 0.400                        | -0.242                       | 0.017  | -0.249          | -0.278         | -0.138           | -0.188           | -0.362         | -0.203                                                    | -0.236                           | -0.336            | -0.165          | -0.243                        | -0.135                        | -0.330                                      | 0.024  | -0.054 | 0.709  | 0.496  | 1.000  |        |        |       |
| N/C                                                       | -0.237                       | 0.033                        | -0.079                       | -0.033 | -0.186          | -0.117         | -0.121           | -0.253           | 0.005          | -0.064                                                    | 0.007                            | -0.085            | -0.108          | -0.031                        | -0.178                        | -0.029                                      | 0.023  | 0.214  | -0.424 | -0.618 | -0.186 | 1.000  |        |       |
| DBE                                                       | 0.254                        | 0.282                        | 0.648                        | 0.350  | 0.359           | 0.661          | 0.349            | 0.396            | 0.577          | 0.524                                                     | 0.654                            | 0.545             | 0.737           | 0.618                         | 0.367                         | 0.574                                       | 0.220  | -0.896 | -0.122 | 0.002  | -0.058 | -0.118 | 1.000  |       |
| AI                                                        | 0.122                        | -0.122                       | -0.192                       | -0.247 | -0.129          | -0.275         | -0.123           | -0.114           | -0.252         | -0.152                                                    | -0.295                           | -0.212            | -0.103          | -0.303                        | -0.110                        | -0.247                                      | -0.031 | -0.043 | 0.491  | 0.504  | 0.684  | -0.442 | -0.065 | 1.000 |

Table A7. Pearson Correlation Coefficients

| n  | Ion PMF Contributors |           | Ion PMF Contributors<br>(Outliers Removed) |           | Combined PMF Contributors |           |
|----|----------------------|-----------|--------------------------------------------|-----------|---------------------------|-----------|
|    | Dominant             | Secondary | Dominant                                   | Secondary | Dominant                  | Secondary |
| 1  | 3                    |           | 2                                          | 3         | 5                         |           |
| 2  | 1                    | 5         | 1                                          |           | 1                         | 4         |
| 3  | 5                    |           | 3                                          |           | 1                         |           |
| 4  | 3                    |           | REMOVED                                    |           | 5                         |           |
| 5  | 2                    | 1         | 3                                          |           | 3                         | 4         |
| 6  | 2                    | 5         | 3                                          |           | 3                         |           |
| 7  | 1                    | 2         | 5                                          |           | 3                         | 4         |
| 8  | 3                    |           | 2                                          |           | 5                         |           |
| 9  | 3                    |           | 1                                          |           | 5                         |           |
| 10 | 1                    |           | 1                                          | 2         | 4                         |           |
| 11 | 1                    |           | REMOVED                                    |           | 4                         |           |
| 12 | 4                    |           |                                            |           | 2                         |           |
| 13 | 4                    |           |                                            |           | 2                         |           |
| 14 | 2                    |           | 4                                          | 2         | 3                         |           |
| 15 | 2                    | 5         | 4                                          |           | 3                         |           |
| 16 | 5                    |           | 4                                          |           | 1                         |           |
| 17 | 1                    |           | 5                                          |           | 4                         |           |
| 18 | 1                    |           | 5                                          |           | 4                         |           |
| 19 | 1                    |           | 5                                          |           | 4                         |           |
| 20 | 1                    |           | 5                                          |           | 4                         | 3         |
| 21 | 2                    | 1         | 5                                          |           | 3                         | 4         |
| 22 | 2                    |           | 3                                          |           | 3                         |           |
| 23 | 5                    |           | 4                                          |           | 1                         |           |
| 24 | 3                    |           | 2                                          |           | 5                         |           |
| 25 | 3                    |           | 2                                          |           | 5                         |           |
| 26 | No Ion Data          |           |                                            |           |                           |           |
| 27 |                      |           |                                            |           |                           |           |
| 28 |                      |           |                                            |           |                           |           |
| 29 |                      |           |                                            |           |                           |           |
| 30 |                      |           |                                            |           |                           |           |
| 31 |                      |           |                                            |           |                           |           |
| 32 |                      |           |                                            |           |                           |           |

Table A8. Primary and Secondary Contributing Factors

| Sample<br>n | Date<br>(d/m/yyyy) | NH <sub>4</sub> <sup>+</sup><br>(μM) | NO <sub>2</sub> <sup>-</sup><br>(μM) | NO <sub>3</sub> <sup>-</sup><br>(μM) | DON<br>(μM) | TDN<br>(μM) | Na <sup>+</sup><br>(μM) | K <sup>+</sup><br>(μM) | Ca <sup>2+</sup><br>(μM) |
|-------------|--------------------|--------------------------------------|--------------------------------------|--------------------------------------|-------------|-------------|-------------------------|------------------------|--------------------------|
| 1           | 26-<br>27/02/2020  | 14.1                                 | 0.55                                 | 3.6                                  | 15.94       | 34.2        | 3.7                     | 2.8                    | 1.9                      |
| 2           | 27-<br>28/02/2020  | 27.7                                 | 0.58                                 | 15.7                                 | 13.66       | 57.6        | 1.5                     | 1.6                    | 3.7                      |
| 3           | 01-<br>02/03/2020  | 10.9                                 | 0.51                                 | 3.8                                  | 5.99        | 21.2        | 1.5                     | 1.1                    | 1.2                      |
| 4           | 19-<br>20/03/2020  | 19                                   | 0.55                                 | 15.7                                 | 21.81       | 57.1        | 18.8                    | 15.3                   | 41                       |
| 5           | 20-<br>21/03/2020  | 22.6                                 | 0.52                                 | 9.2                                  | 24.51       | 56.8        | 1.7                     | 1.8                    | 3.2                      |
| 6           | 29/03/2020         | 2                                    | 0.51                                 | 2                                    | 9.45        | 13.9        | 0.7                     | 0.9                    | 1.3                      |
| 7           | 3/4/2020           | 53                                   | 0.59                                 | 15.4                                 | 13.34       | 82.3        | 2.4                     | 3.5                    | 3.6                      |
| 8           | 14/4/2020          | 16.1                                 | 0.54                                 | 5.7                                  | 10.61       | 33          | 9                       | 5.4                    | 2.4                      |
| 9           | 23/5/2020          | 12.9                                 | 0.55                                 | 4.5                                  | 7.78        | 25.8        | 5.6                     | 4.1                    | 4.7                      |
| 10          | 7/6/2020           | 59.1                                 | 0.53                                 | 17.2                                 | 30.55       | 107.3       | 4.7                     | 4.5                    | 5.5                      |
| 11          | 22/9/2020          | 84.4                                 | 1.38                                 | 27                                   | 62.78       | 175.6       | 3.3                     | 6                      | 6.7                      |
| 12          | 28/9/2020          | 119.5                                | 1.02                                 | 37.3                                 | 24.52       | 182.3       | 4                       | 10.9                   | 18.1                     |
| 13          | 18/10/2020         | 53                                   | 0.27                                 | 127.8                                | 46.89       | 227.9       | 5                       | 14.9                   | 6.3                      |
| 14          | 19-<br>20/10/2020  | 45.9                                 | 0.309                                | 20.8                                 | 29.7        | 96.7        | 2.6                     | 4.7                    | 5.9                      |
| 15          | 20/10/2020         | 9.6                                  | 0.125                                | 7.4                                  | 38.25       | 55.4        | 0.8                     | 1.1                    | 1.7                      |
| 16          | 24/10/2020         | 29.1                                 | 0.125                                | 10.3                                 | 31.49       | 71          | 1.4                     | 1.4                    | 2.4                      |
| 17          | 29-<br>30/10/2020  | 69                                   | 0.352                                | 31.7                                 | 36.55       | 137.5       | 2.7                     | 2.8                    | 4.5                      |
| 18          | 12/11/2020         | 53.1                                 | 0.319                                | 18.4                                 | 17.59       | 89.4        | 1.7                     | 3.9                    | 4                        |
| 19          | 13-<br>14/11/2020  | 70.4                                 | 1.658                                | 29.2                                 | 47.11       | 148.4       | 2.3                     | 6.4                    | 6.9                      |
| 20          | 18/11/2020         | 61.9                                 | 1.106                                | 24.8                                 | 10.28       | 98.1        | 1                       | 3.8                    | 4                        |
| 21          | 18/11/2020         | 38.5                                 | 1.233                                | 20.5                                 | 13.97       | 74.1        | 1.2                     | 2.4                    | 3.3                      |
| 22          | 18-<br>19/11/2020  | 34                                   | 1.257                                | 22.6                                 | 12.33       | 70.1        | 4                       | 5.2                    | 7.6                      |
| 23          | 04-<br>05/12/2020  | 33.4                                 | 0.161                                | 54.7                                 | 11.72       | 100.1       | 4.4                     | 2.6                    | 3.8                      |
| 24          | 6/12/2020          | 42.9                                 | 0.213                                | 15.8                                 | 0.65        | 59.6        | 4.8                     | 4                      | 1.7                      |
| 25          | 12-<br>13/12/2020  | 7.4                                  | 0.2                                  | 0.4                                  | 9.81        | 17.9        | 1.8                     | 1                      | 0.4                      |
| 26          | 13-<br>14/01/2021  | 16.9                                 | <LD                                  | 6.2                                  | NA          | 23.1        | 1                       | 0.7                    | 1.2                      |
| 27          | 18-<br>19/01/2021  | 37.9                                 | <LD                                  | 14.9                                 | NA          | 52.8        | 6.5                     | 2.9                    | 4.1                      |
| 28          | 21/2/2021          | 36.6                                 | <LD                                  | 11.7                                 | NA          | 48.3        | 3.6                     | 3.1                    | 6                        |
| 29          | 06-<br>07/03/2021  | 6.2                                  | <LD                                  | 2.4                                  | NA          | 8.6         | 1                       | 6.2                    | 1.2                      |
| 30          | 18/4/2021          | 25.9                                 | 0.3                                  | 13.6                                 | NA          | 39.8        | 5.3                     | 2.2                    | 7.9                      |
| 31          | 18/4/2021          | 10.4                                 | <LD                                  | 7.3                                  | NA          | 17.7        | 1.8                     | 1.8                    | 0.7                      |
| 32          | 10/6/2021          | 27.6                                 | <LD                                  | 10.9                                 | NA          | 38.5        | 3.1                     | 4.6                    | 3.9                      |

| Sample n | Mg <sup>2+</sup><br>(μM) | F <sup>-</sup><br>(μM) | C <sub>2</sub> H <sub>3</sub> O <sub>3</sub> <sup>-</sup><br>(μM) | H <sub>3</sub> CCOO <sup>-</sup><br>(μM) | HCOO <sup>-</sup><br>(μM) | Cl <sup>-</sup><br>(μM) | PO <sub>4</sub> <sup>3-</sup><br>(μM) | SO <sub>4</sub> <sup>2-</sup><br>(μM) | C <sub>2</sub> O <sub>4</sub> <sup>2-</sup><br>(μM) | DOC<br>(μM) |
|----------|--------------------------|------------------------|-------------------------------------------------------------------|------------------------------------------|---------------------------|-------------------------|---------------------------------------|---------------------------------------|-----------------------------------------------------|-------------|
| 1        | 0.66                     | 0.2                    | 0.2                                                               | 4.1                                      | 3.1                       | 3.6                     | <LQ                                   | 1.2                                   | 0.28                                                | 119         |
| 2        | 0.94                     | 0.25                   | 0.51                                                              | 3.6                                      | 8.1                       | 3.2                     | 0.13                                  | 4.8                                   | 0.65                                                | 208         |
| 3        | 0.31                     | 0.27                   | 0.36                                                              | 0.4                                      | 2.4                       | 2.5                     | 0.11                                  | 1.6                                   | 0.35                                                | 89          |
| 4        | 6.48                     | 0.21                   | 0.53                                                              | 2.1                                      | 0.8                       | 9.9                     | 0.12                                  | 1.9                                   | 0.51                                                | 146         |
| 5        | 1.06                     | 0.26                   | 0.38                                                              | 1.6                                      | 3.1                       | 2.6                     | 0.15                                  | 1.5                                   | 0.28                                                | 145         |
| 6        | 0.31                     | 0.18                   | 0.35                                                              | 0.7                                      | 2.2                       | 1.7                     | 0.11                                  | 0.4                                   | 0.25                                                | 92          |
| 7        | 1.43                     | 0.24                   | 2.02                                                              | 1.3                                      | 28.8                      | 4.8                     | 0.38                                  | 4.5                                   | 0.55                                                | 257         |
| 8        | 0.76                     | 0.25                   | 0.36                                                              | 0.4                                      | 7.3                       | 2.4                     | 0.33                                  | 2.2                                   | 0.31                                                | 152         |
| 9        | 1.56                     | 0.28                   | 0.38                                                              | 3.8                                      | 5.4                       | 4.4                     | 0.39                                  | 5.4                                   | 0.44                                                | 167         |
| 10       | 2.07                     | 0.12                   | 0.85                                                              | 1.3                                      | 36.1                      | 4.5                     | 0.39                                  | 5.3                                   | 1.03                                                | 322         |
| 11       | 2.05                     | <LD                    | 0.95                                                              | 9.2                                      | 40.5                      | 4.1                     | 0.4                                   | 10.4                                  | 0.12                                                | 1073        |
| 12       | 6.95                     | <LD                    | 10.35                                                             | <LD                                      | 301.3                     | 8.4                     | <LD                                   | 60.4                                  | <LD                                                 | 585         |
| 13       | 3.68                     | 2.68<br>5              | 16.03                                                             | 31                                       | 695.4                     | 16.6                    | 1.321                                 | 44.2                                  | 6.522                                               | 964         |
| 14       | 2.38                     | 0.60<br>8              | 1.54                                                              | 3.6                                      | 47.6                      | 4.4                     | 0.699                                 | 3.7                                   | 1.572                                               | 710         |
| 15       | 0.26                     | 0.18<br>4              | 0.55                                                              | 2.3                                      | 20.5                      | 1.8                     | <LD                                   | 1.4                                   | 0.539                                               | 599         |
| 16       | 0.22                     | <LD                    | 2.35                                                              | 2.4                                      | 13.7                      | 5.4                     | <LD                                   | 3.3                                   | <LD                                                 | 833         |
| 17       | 1.35                     | 0.85<br>7              | 2.58                                                              | 3.7                                      | 51.1                      | 5.9                     | <LD                                   | 7.6                                   | 1.9                                                 | 878         |
| 18       | 1.54                     | 0.22<br>5              | 1.89                                                              | 4.4                                      | 47.8                      | 4.3                     | 0.294                                 | 4.2                                   | 0.488                                               | 863         |
| 19       | 0.89                     | 0.35<br>5              | 2.52                                                              | 10.3                                     | 19.3                      | 6.8                     | 0.323                                 | 6.6                                   | 0.919                                               | 752         |
| 20       | 0.99                     | 0.35                   | 1.93                                                              | 8.6                                      | 12.7                      | 4.1                     | <LD                                   | 4.9                                   | 0.532                                               | 877         |
| 21       | 0.75                     | 0.30<br>1              | 2.91                                                              | 10.3                                     | 20.6                      | 3.4                     | <LD                                   | 3.2                                   | 0.441                                               | 807         |
| 22       | 1.03                     | 0.22<br>2              | 2.61                                                              | 3.8                                      | 3.6                       | 6.8                     | 0.612                                 | 2.2                                   | 0.788                                               | 571         |
| 23       | 1.03                     | 0.55<br>1              | 4.09                                                              | 6                                        | 129.3                     | 8.7                     | <LD                                   | 5.6                                   | 0.211                                               | 795         |
| 24       | 0.55                     | 0.19<br>6              | 1.69                                                              | 3                                        | 29.5                      | 5.1                     | <LD                                   | 1.7                                   | 0.626                                               | 648         |
| 25       | 0.14                     | <LD                    | 0.07                                                              | 2.2                                      | 0.4                       | 1.5                     | <LD                                   | 0.7                                   | <LD                                                 | 433         |
| 26       | 0.2                      | <LD                    | <LD                                                               | 4.9                                      | 6.5                       | 1.6                     | <LD                                   | 0.5                                   | 0.2                                                 | 843         |
| 27       | 0.9                      | <LD                    | 1.8                                                               | 11.7                                     | 12.6                      | 5.9                     | <LD                                   | 1.8                                   | 0.8                                                 | 918         |
| 28       | 1.6                      | <LD                    | 3.5                                                               | 9.3                                      | 8.5                       | 3.7                     | 0.4                                   | 5.7                                   | 0.9                                                 | 217         |
| 29       | 0.3                      | 0.1                    | 0.5                                                               | 0.4                                      | 0.6                       | 2.6                     | 0.1                                   | 0.2                                   | <LD                                                 | 165         |
| 30       | 2.1                      | <LD                    | 1.5                                                               | 8.1                                      | 6.9                       | 4.8                     | <LD                                   | 2.7                                   | 0.4                                                 | 255         |
| 31       | 0.1                      | <LD                    | 1.6                                                               | 3.8                                      | 3.7                       | 7.8                     | <LD                                   | 1.9                                   | 0.2                                                 | 211         |
| 32       | 1.24                     | 0.2                    | 1.9                                                               | 8.2                                      | 12.6                      | 4.5                     | <LD                                   | 5                                     | 0.1                                                 | 282         |

Table A9. Inorganic and Organic Species concentrations for all Samples