Single Particle SEM-EDX Analysis of Iron-Containing Coarse Particulate Matter in an Urban Environment: Sources and Distribution of Iron within Cleveland, Ohio Andrew P. Ault, <sup>1</sup> Thomas M. Peters, <sup>2</sup>\* Eric J. Sawvel, <sup>2</sup> Gary S. Casuccio, <sup>3</sup> Robert D. Willis, <sup>4</sup> Gary A. Norris, <sup>4</sup> and Vicki H. Grassian <sup>1</sup>\*

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### Abstract

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The physicochemical properties of coarse-mode, iron-containing particles, and their temporal and spatial distributions are poorly understood. Single particle analysis combining x-ray elemental mapping and computer-controlled scanning electron microscopy (CCSEM-EDX) of passively collected particles was used to investigate the physicochemical properties of ironcontaining particles in Cleveland, Ohio in summer 2008 (Aug.-Sept.), summer 2009 (Jul.-Aug.), and winter 2010 (Feb.-Mar.). The most abundant classes of iron-containing particles were mineral dust, iron oxide fly ash, NaCl containing agglomerates (likely from road salt), and Ca-S containing agglomerates (likely from slag, a byproduct of steel production, or gypsum in road salt). The mass concentrations of anthropogenic fly ash particles were highest in the Flats region (downtown) and decreased with distance away from this region. The concentrations of fly ash in the Flats region were consistent with inter-annual changes in steel production. These particles were observed to be highly spherical in the Flats region, but less so after transport away from downtown. This change in morphology may be attributed to atmospheric processing. Overall, this work demonstrates that the method of passive collection with single particle analysis by electron microscopy is a powerful tool to study spatial and temporal gradients in components of coarse particles. These gradients may correlate with human health effects associated with exposure to coarse-mode PM.

#### Introduction

Ambient particulate matter (PM) has been associated with negative impacts on human health, including adverse respiratory, cardiovascular, and cardiopulmonary health outcomes. While the effects of fine PM, PM<sub>2.5</sub> (PM < 2.5  $\mu$ m, aerodynamic diameter) have long been established, coarse PM, PM<sub>10-2.5</sub>, (10  $\mu$ m > PM > 2.5  $\mu$ m, aerodynamic diameter) has recently received greater attention. Positive associations have been observed between PM<sub>10-2.5</sub> and a variety of health problems including cardiovascular diseases, mortality, asthma, respiratory diseases, and chronic obstructive pulmonary disease (COPD). Knowledge of the chemical species in PM<sub>10-2.5</sub> is needed to better understand these health effects and to identify sources for possible regulatory action.

Transition metals in PM have been identified as potentially important contributors to biological responses that lead to adverse health effects. Iron is the most abundant transition metal in the atmosphere that may either be lofted into the atmosphere as wind-blown mineral dust or emitted as a byproduct of combustion processes (e.g. coal combustion), steelworks, and other industrial sources. In Iron particles from combustion can represent more than 50% of the total iron deposited in areas near combustion sources and at remote sites. Iron in particles from combustion processes is more soluble than iron in mineral dust and therefore thought to be more bioavailable, which could have important health implications. The chemical form of iron, and thus bioavailability, of natural mineral dust vs. anthropogenic combustion is being studied from both chemical and biogeochemical perspectives.

Given its abundance in the atmosphere, the health effects of iron have been investigated in a number of studies.<sup>17-19</sup> Ghio and Devlin showed that PM emitted from a steel mill adversely impacted pulmonary health greater than a similar amount of PM from the same area when the mill was not in production, attributable to metals including iron.<sup>18</sup> Carter et al. showed that iron (as well as vanadium and nickel) increased cytokine production in human airway epithelial cells.<sup>19</sup> Wei et al. reported that PM containing iron increased reactive oxygen species (ROS), activated NF-κB, and led to cell death.<sup>17</sup> Verma et al. found that iron in diesel exhaust particles explained 84% of the variance in ROS produced by an in vitro macrophage-based assay.<sup>20</sup> Ironrich particles from Saharan dust storms have been associated with increased daily mortality in Spain.<sup>21</sup>

New sampling and analysis methods are available to study the inter-annual and spatial variability in the physicochemical properties of metal-containing coarse particles. Since concentrations of coarse particles have spatial distributions that are often highly heterogeneous due to their shorter atmospheric lifetimes compared to fine particles,<sup>5</sup> it is important to determine their spatial variability and changes in their physicochemical properties. Passive samplers are a low cost, energy efficient method to collect multiple samples simultaneously in different locations.<sup>22-25</sup> Mass concentrations determined with passive samplers have demonstrated strong correlation with dichotomous samplers,<sup>22</sup> and are increasingly being used to investigate spatial variability of PM<sub>10-2.5</sub> in urban areas.<sup>26,27</sup> Recently, improved microscopy and spectroscopy methods have been applied to iron-containing particles, including: scanning electron microscopy (SEM),<sup>28</sup> microfocused X-ray absorption spectroscopy (μ-XAS),<sup>29</sup> micro-focused X-ray diffraction (μ-XRD),<sup>29,30</sup> and micro-X-ray absorption near edge spectroscopy (μ-XANES).<sup>30,31</sup>

In this study, we investigate the concentration, chemical composition and physical properties of iron-containing particles passively sampled in the Cleveland, Ohio air shed, using single particle electron microscopy. Of particular interest is the heterogeneous chemistry of combustion-generated iron-containing particles (referred to hereafter as fly ash), which has the potential to lead to higher concentrations of bioavailable iron upon inhalation and could lead to adverse health effects.<sup>32</sup> The spatial distribution and concentration of fly ash particles followed trends in emissions from anthropogenic sources. These particles were also found to evolve as they move away from their source. Given the spatial and interannual variation in sources and concentrations, efforts to improve the exposure assessments spatially within urban areas are necessary to avoid potential misidentification of underlying causes for negative health effects due to particulate matter.

## **Experimental Methods**

Cleveland Sampling Sites. Sampling of PM<sub>10-2.5</sub> was conducted in Cleveland, Ohio in summer 2008, summer 2009, and winter 2010 as part of the Environmental Protections Agency's Cleveland Multiple Air Pollutants Study (CMAPS) (http://www.rtord.epa.gov/ordfactsheets/index.cfm?fuseaction=home.FactSheetDetail&FactSheetID=460). Sampling sites were distributed across the Cleveland metropolitan area from the industrial Flats region adjacent to downtown out to suburban Medina (~33 miles southwest of downtown). Twenty-five sites were chosen for the 2008 study based on a satellite-based remote sensing method to design spatial sampling for intra-urban population exposure assessment, 33 which was applied to the Cleveland area. 34 Different monitoring sites were used for the 2009 and

2010 studies, although there was some overlap with the 2008 sites. The process used to select sites is described by Mukerjee et al., 35 and was based on a land-use regression (LUR) modeling study. The selection of these sites was based on the need to span the mathematical space determined by the model's explanatory variables (e.g., traffic intensity, distance to roadways, and other urban land-use variables).

Samples were collected on polycarbonate substrates inside a passive sampler housing designed to minimize the effects of wind and precipitation.<sup>36</sup> Seven-day samples were collected each week for three weeks in 2008 (August 12- September 2), five weeks in 2009 (July 27 – August 29), and five weeks in 2010 (February 1 – March 9). This region experienced an economic downturn in late 2008 (after our measurements were complete) that led to extensive industrial site closures in 2009 followed by the reopening of some sites in 2010. In 2009, lower industrial emissions resulted from no steel production during the sampling period, while in 2010 5,000 tons of steel were produced daily.<sup>37</sup> 2008 emissions inventory data is similar to 2010.<sup>37,38</sup> For the duration of the winter 2010 study, snow cover, which has been shown to suppress dust emission,<sup>39-42</sup> was prevalent across the region,<sup>43</sup> increasing with further distance from downtown.

Computer-Controlled Scanning Electron Microscopy Analysis. Substrates were analyzed by computer-controlled SEM (CCSEM) measurements with a Personal SEM<sup>®</sup>. 44,45 For 2008, 2009, and 2010 the number of particles analyzed each year was 29,331, 49,329, and 53,105, respectively. This automated analysis captured single particle physical properties, including: average diameter (d<sub>ave</sub>), maximum diameter (d<sub>max</sub>), minimum diameter (d<sub>min</sub>), circular diameter (d<sub>circ</sub>), projected area, and perimeter. Although particles across all size ranges up to

approximately 150 µm in diameter can deposit on the passive sampler, the CCSEM analysis for these samples was confined only to particles satisfying 1.0  $\mu$ m  $< d_a < 10 \mu$ m ( $d_a$  is aerodynamic diameter), in order to capture the supermicron PM fraction. The process for converting to mass concentration is described in detail in Wagner and Leith<sup>23</sup> and Ott et al.<sup>22</sup> Briefly, aerodynamic diameter and particle mass are calculated from projected area diameter through the use of a volumetric shape factor, aerodynamic shape factor, and particle density from tables for specified oxides based on chemical composition.<sup>22</sup> Particle mass loading on the sample was converted to ambient mass concentration using an empirically-derived deposition velocity model.<sup>23,24</sup> Further details on the calculation of mass concentration from SEM data are given in Supporting Information. Energy dispersive x-ray spectrometry (EDX) was used to determine the elemental composition of individual particles. EDX spectra from individual particles were analyzed using a vector based algorithm to determine the relative abundance of 19 elements: carbon (C), sodium (Na), magnesium (Mg), aluminum (Al), silicon (Si), phosphorus (P), sulfur (S), chlorine (Cl), potassium (K), calcium (Ca), titanium (Ti), chromium (Cr), manganese (Mn), iron (Fe), nickel (Ni), copper (Cu), zinc (Zn), barium (Ba), and lead (Pb). 44 Iron-containing particles are defined as those with a K-α peak at 6.4 keV representing greater than 2% of the quantified elemental composition.

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Data Analysis. Single particle data from the CCSEM-EDX analysis were imported into MATLAB R2010a (MathWorks, Inc.) for analysis. Particles were analyzed through queries on particle composition (Fe > 2%) and clustering using the k-means algorithm in the MATLAB toolbox. Clustering algorithms have been applied to CCSEM-EDX data for over 20 years, with the most commonly used algorithm being adaptive resonance theory 2a (ART2a). In

more recent years, the use of clustering for real-time single-particle mass spectrometry analysis has shown that k-means is as effective as ART2a and is considerably simpler and faster to run.<sup>49</sup> Further discussion of the application of clustering and error reduction is given in the Supporting Information. After clustering, clusters were grouped into the basic classes based on mathematical similarity, elemental composition and comparison with the literature, discussed below.

#### Results and Discussion

Particles Containing Iron. The mass concentration by size of all particles, iron-containing particles, and the fraction of iron-containing particles per year are shown in Figure 1. (See Sawvel et al.<sup>50</sup> for detailed analysis of all coarse particle mass, including the seasonal and interannual variability of major particle classes). The mass concentration of all particles and iron-containing particles were very similar in summer 2008 and summer 2009. In winter 2010, the mass concentration of all particles was shifted to slightly larger particle sizes potentially due to a large contribution of NaCl particles from application of road salt across the region. The fraction of particles containing iron (blue line) was higher in summer 2008 and 2009 compared to winter 2010, when road salt was a large fraction of PM<sub>10-2.5</sub>. Figure 1 shows that iron-containing particles contribute substantially to coarse PM. However, the chemical composition and properties of the iron-containing particles differ to a greater degree than is implied from the mass concentrations and fractions, as discussed below.

Major Classes of Iron-Containing Particles. The iron-containing particles were categorized into the following classes: fly ash, mineral dust, NaCl agglomerates, and Ca-S agglomerates. Figure 2 shows the average EDX spectrum and digital color histogram for each of the four major classes

of iron-containing particles. The digital color histogram shows the fraction of particles in that class containing a specific element, while the color represents the fraction of particles whose peak intensity falls in that range. For example, 96% of particles in the mineral dust class contain silicon and 19% of all mineral dust particles have silicon peaks comprising 30-50% (red block) of the normalized x-ray counts for an individual particle. Although carbon was measured with CCSEM-EDX, it is difficult, especially for smaller particles, to determine how much of the carbon signal comes from the particle and how much is generated from the underlying polycarbonate substrate. For this reason, carbon was not used in determining particle classification. The number of particles from each class for each year is reported in Table S1 of the Supporting Information.

SEM images of representative particles for the different particle classes observed are shown in Figure 3 (Column 1). Columns 2-6 show EDX elemental maps of Fe, O, Al-Si, and Na-Ca to identify the distribution of the different elements within representative particles. For some particles with high X-ray emission, particles appeared to contain a marker in the elemental map that was not present in the EDX spectra (i.e. Al-Si in fly ash particles). This is a common problem in EDX elemental mapping<sup>51</sup> and samples where there was no evidence of a specific marker in the EDX spectrum are labeled "No Signal In Spectrum" in Figure 3. Particles containing iron that did not fit into one of these five classes are not discussed in detail as they had highly varying composition and represented less than 1% of the PM<sub>10-2.5</sub> mass concentration.

The fly ash class was characterized by particles that contained mostly iron (Figure 2a). These particles were quite spherical (Figure 3a) and contained an even distribution of iron and oxygen

throughout (oxygen was only identified through SEM-EDX mapping), which agrees with previous measurements of fly ash particles emitted from steel facilities.<sup>52,53</sup> The spherical shape is due to the molten nature of the material at high temperatures when the particles are formed during steel production or other industrial processes.<sup>54</sup> Due to their high iron (and low aluminum and silicon) content, these particles are attributed to fly ash from high temperature processes in steel production, though a small fraction may be from power generation or other industrial sources within the air shed.

Mineral dust particles were characterized by high fractions and intensities of aluminum and silicon, likely in the form of aluminosilicates, along with other crustal elements including magnesium, calcium, potassium, and iron (Figure 2b).<sup>55,56</sup> The mineral dust class showed a great deal of variability in composition, and the class shown here represents a combination of four different clusters: silicate dust, aluminosilicate dust, calcium-rich dust, and titanium-rich dust. In contrast to the fly ash particles (Figure 3a), the mineral dust particles displayed an irregular and rough morphology (Figure 3b) due to a mixture of different mineral crystals within a single particle. The elemental maps for mineral dust show a heterogeneous distribution of different minerals within individual particles.<sup>57</sup> Mineral dust makes up the largest fraction of global aerosol mass in the atmosphere<sup>58</sup> and can be lofted into the air by wind<sup>59</sup> and by vehicles on roadways.<sup>60,61</sup>

These major iron-containing classes (mineral dust and fly ash) were observed to be mixed with NaCl and Ca-S as agglomerates (Figures 2c and 2d). The NaCl agglomerate class contained

particles that were frequently cube-shaped with small iron inclusions or iron flakes (Figure 3c). Na and Cl (Cl not shown) were evenly distributed throughout these particles. PM<sub>10-2.5</sub> was highest in winter 2010 probably due to NaCl from road salt either from dry resuspension or resuspension of salt spray from cars traveling on wet roads. These particles were not present in summer 2008 or summer 2009. Road salt is used commonly to improve road conditions in the winter season and has been shown to impact urban PM.<sup>27,62</sup> The particles that compose the Ca-S agglomerate class fall into two categories. The particle shown in Figure 3d is an example of a Ca-S type particle that is an agglomerate with a mineral dust particle. Ca and S are markers for slag and cement production, as has been shown elsewhere.<sup>63</sup> Though less frequent, a Ca-S-O containing agglomerate (most likely gypsum - CaSO<sub>4</sub>) was observed as well (as in Figure 3c) associated with aqueous droplets containing NaCl particles, likely gypsum from road salt. Ca-S agglomerates were not observed in 2008 and 2009. Elemental mapping was valuable in confirming the two primary forms of iron-containing particles: mineral dust and fly ash, and in identifying agglomerates of the primary iron-containing particles with abundant non-iron-containing classes.

Circularity and Aspect Ratio of the Different Major Classes. Particles in each of the four main classes and the "Other" category were binned according to circularity (C) and aspect ratio (AR), equations 1 and 2, respectively:

$$C = 4\pi \frac{A}{P^2} \tag{1}$$

$$AR = \frac{d_{max}}{d_{perp}} \tag{2}$$

where A = area of the particle, P = perimeter of the particle,  $d_{max}$  is the maximum diameter of the particle and  $d_{perp}$  is the diameter perpendicular to  $d_{max}$ . The normalized circularity and aspect ratio (binned logarithmically to highlight values close to unity) for each year are shown in Figure 4. Circularity of 1 indicates a particle that is perfectly spherical, while an aspect ratio of 1 denotes a particle that is not elongated in any direction. The particles in the fly ash class had the highest circularities and the lowest aspect ratios, as would be expected for spherical particles. Interestingly, during the steel industry shutdown in 2009, the average circularity of the fly ash class of particles decreased compared to 2008 and 2010. A possible explanation is that the fly ash class of 2009 came from other sources (sources not emitting spherical particles) or comprises particles that have undergone heterogeneous reactions which break down the particle and decrease particle sphericity,  $^{32}$  or adsorption of secondary species with less than complete surface coverage leading to increased surface roughness and reduced sphericity (see Figure S2 in Supporting Information).

The mineral dust and particle class, observed in all three years, showed consistent, non-spherical circularity and aspect ratio distributions (Figure 4). The NaCl and Ca-S agglomerates were only observed in 2010 and were both quite non-spherical as well, though the NaCl agglomerate may have been aqueous and thus spherical prior to loss of water on the substrate or in the SEM. It should be noted that if any of these particles were in the aqueous phase and solidified under the vacuum of the SEM they may appear less spherical than they were when present in the atmosphere.

Mass Distributions of the Five Major Classes. Figure 5 shows stacked mass size distributions for the main particle classes averaged across all sites for each sampling year (column 1), averaged for sites in the Cleveland Flats where industrial sources are concentrated (column 2), averaged for the rest of Cleveland (column 3), and averaged for the rural background site at Medina (column 4). Additionally, the mass size distribution for all particles is shown (black line) to provide context as to the contribution of iron-containing particles to the coarse mass concentration in each region. As Medina was not used in 2008 a map of the sites across the Cleveland area is shown. Previous studies have shown maps of the Cleveland area and sources, 64 as well as sites used for the CMAP studies.34,50 The mineral dust concentrations in 2008 and 2009 were quite similar, as were their percentage of total coarse mass (21 and 17%, respectively), indicating inter-annual consistency in background mineral dust concentrations in summer. The lower concentrations observed in winter are likely due to the snow cover<sup>43</sup> reducing wind-blown suspension of mineral dust. 39-42 Models have predicted lower windblown dust emissions for Cleveland in winter, while anthropogenic fugitive dusts are predicted to be constant year round under typical conditions.<sup>65</sup> The mass concentration of fly ash particles and percent of iron-containing mass was notably lower in 2009 (12%) than in 2008 (28%) or 2010 (32%), consistent with the shutdown of steel production facilities in 2009. During this shutdown, fly ash concentrations decreased across all sites, most notably in the Flats, but also in the rest of Cleveland. If, as seems likely, these decreases were in response to the temporary shutdown of the steel facilities, then the data in Figure 5 show that the potential for exposure to iron-containing emissions from sources in the Flats extends across the entire Cleveland metropolitan area.

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The mass concentration of all classes of iron-containing particles decreased with increasing distance from the Flats (Figure 5, columns 2-4). The decrease was similar for fly ash particles in summer 2008 and winter 2010, but less dramatic in summer 2009. The reduced spatial gradient in 2009 is again likely due to the shutdown of emission sources in the Flats for that year.

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Similar spatial patterns were observed for mineral dust particles with decreasing concentrations with increasing distance away from the Flats. (Medina was not sampled in 2008). In summer 2009 (during the economic downturn), this decrease was smaller for both total and ironcontaining particle concentrations. In winter 2010, substantial mineral dust concentrations were observed in the Flats, although they were quite low at Medina. The rural nature of the Medina site may lead to a greater fraction of snow cover that likely suppresses wind-blown dust, whereas the high volume of industry and road activity may lead to significant concentrations of resuspended road dust in the Flats even in winter. Consequently, we attribute mineral dust in winter to anthropogenic influences, whereas mineral dust in the summer of 2009, during a period of reduced industrial output is attributed to naturally occurring wind-blown resuspension. The highest mineral dust concentrations (summer 2008 in the Flats) are attributed to a combination of anthropogenic sources of mineral dust (road dust and industry) and naturally occurring dust. The concentration of NaCl agglomerates was also highest in the Flats, where there is a high volume of vehicular traffic and road salt dispersal combined with a high concentration of iron-containing particles. Ca-S agglomerates were also highest in the Flats consistent with the close vicinity of steel and cement production.

Processing of Fly Ash Particles during Atmospheric Transport. The findings in this study suggest that fly ash particles react and lose sphericity during transport away from their predominant source in the Flats, a contrast to increases in sphericity that are observed for submicron particles with high sulfur content. 66 The circularities of fly ash particles were grouped by location, binned, and normalized for 2008 and 2010 when there was significant steel production in the Flats (Figure 6). More than  $26 \pm 1\%$  of the fly ash particles were near-perfect spheres (circularity > 0.95) in the Flats, compared to less than  $11 \pm 1\%$  away from the Flats, with circularity distributions peaking at 0.80 in 2008 and 0.83 in 2010. The particles at Medina in 2010 have a similar distribution to the rest of Cleveland and are significantly less spherical than fly ash in the Flats region (7  $\pm$  2 % in spherical bin), which suggests that the particles have likely already aged or were emitted from different sources that produce less spherical particles. The circularities of the other particle classes did not change appreciably with distance from the Flats (not shown). Taken together, the spatially resolved circularity data indicate that fly ash particles most likely either react with inorganic acids (i.e. sulfuric acid) causing their spherical shape to degrade or take up secondary species in a non-uniform manner during transport to downwind locations across the metropolitan area. Figure S2 in the Supporting Information shows a particle that may have undergone processes leading to a decrease in sphericity. Changes to fly ash chemical and physical properties due to such reactions have been demonstrated in recent laboratory studies.67

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#### Atmospheric Implications

The two-season Cleveland study provided a unique opportunity to characterize coarse PM over a three year time period during which a major industrial activity was shut down. Iron-containing

particles from natural and anthropogenic sources were found to represent a significant fraction of total PM<sub>10-2.5</sub> in the Cleveland air shed. The importance of anthropogenic iron-containing particles in the atmosphere has been highlighted in recent years, particularly as soluble iron concentrations have exceeded estimates based solely on mineral dust aerosol. 12 Determining sources of iron-containing particles and understanding the distribution and evolution of these particles across urban air sheds are critically important to better understand and predict adverse health effects from exposure to PM. Herein, we have shown that industrial sources can be a major source of iron-containing particles, particularly fly ash, across the Cleveland air shed. The concentration of these particles decreases strongly with distance from source emissions. For example, fly ash particles attributed to steel production were present in high concentrations in 2008 and 2010 in the industrial Flats region downtown and transported across the Cleveland metropolitan area. These fly ash particles lose their spherical shape during transport to suburban areas possibly due to heterogeneous reactions and secondary species condensation. Such processes could potentially increase the amount of soluble, bioavailable iron en route. Interestingly, even naturally occurring iron-containing mineral dust particles are suspended in the atmosphere to a greater degree in areas with high vehicular traffic and industrial production. To fully evaluate the health effects posed by iron-containing particles further studies are needed to better understand the different types of iron-containing aerosols observed in highly populated areas, their spatial and temporal variability, as well as the effect of heterogeneous reactions and how these reactions may lead to more bioavailable iron that has the potential to lead to greater negative health effects.

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**Figure Captions** 

Figure 1: Mass concentration by size of all particles (gray), iron-containing particles (red), and the fraction of iron-containing particles (blue line) in a) summer 2008, b) summer 2009, and c) winter 2010.

Figure 2: Average spectra and digital color histograms of different particle classes containing iron: a) fly ash, b) mineral dust, c) NaCl agglomerates, and d) Ca-S agglomerates. Average spectra are given as a relative area across the 19 elements analyzed by CCSEM-EDX (C, Na, Mg, Al, Si, P, S, Cl, K, Ca, Ti, Cr, Mn, Fe, Ni, Cu, Ni, Ba, and Pb). Digital color histogram heights represent the fraction of particles containing a specific element and colors represent the fraction containing specific ranges of intensities.

Figure 3: SEM images and EDX elemental maps of representative particles: a) fly ash, b) mineral dust, c) NaCl agglomerate, and d) Ca-S agglomerate. Elemental maps of Fe (red), O (green), Al (blue) or Si (aqua), and Na (orange) or Ca (pink), are shown for each class.

Figure 4: Circularity and aspect ratio of fly ash (green), mineral dust (brown), NaCl agglomerates (aqua), Ca-S agglomerates (orange), and other classes (gray) of iron-containing particles in a) summer 2008, b) summer 2009, and c) winter 2010.

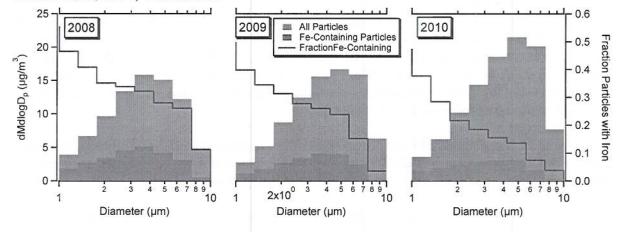
Figure 5: Mass concentration by size of total particles (black line), fly ash (green), mineral dust (brown), NaCl agglomerates (aqua), Ca-S agglomerates (orange) in a) summer 2008, b) summer 2009, and c) winter 2010. Columns provide geographic segregation of size distributions with average across all sites (column 1), sites in the Cleveland Flats (column 2), Rest of Cleveland (column 3), and Medina (column 4). Inset upper right is a topographic map of the Cleveland area with different sites color coded by category: Flats (red), Rest of Cleveland (blue), Medina (green). For a detailed map of sources and sites in Cleveland see refs. 34,50,64 Note: Medina site was not used in 2008.

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Figure 6: Circularity distributions for fly ash particles in a) summer 2008 and b) winter 2010 for the Cleveland Flats (solid line), Rest of Cleveland (dashed line), and Medina (2010 only, dotted line).

# Figure Captions

Figure 1: Mass concentration by aerodynamic diameter of all particles (gray), iron-containing particles (red), and the fraction of iron-containing particles (blue line) in a) summer 2008, b) summer 2009, and c) winter 2010.

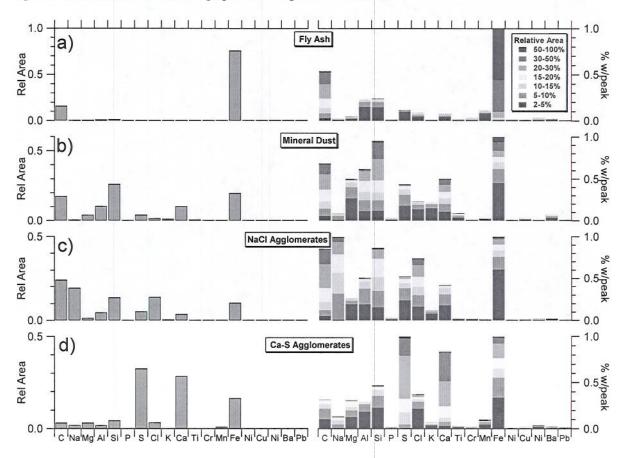


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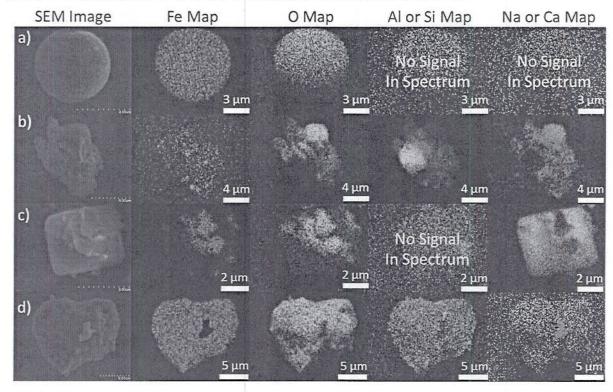


Figure 4: Circularity and aspect ratio of fly ash (green), mineral dust (brown), NaCl agglomerates (aqua), Ca-S agglomerates (orange), and other classes of iron-containing particles in a) summer 2008, b) summer 2009, and c) winter 2010.

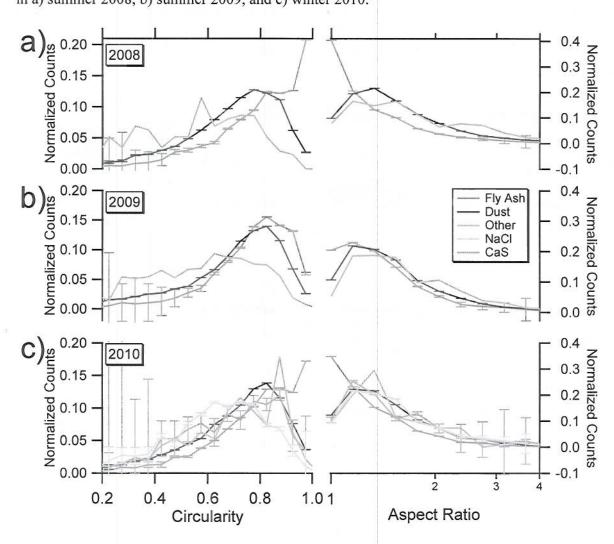
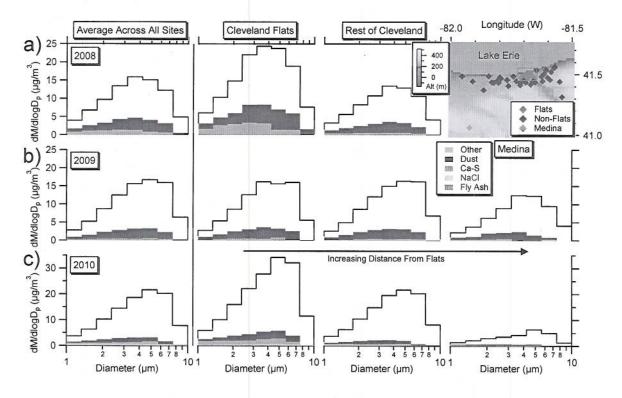


Figure 5: Mass concentration by size of total particles (black line), fly ash (green), mineral dust (brown), NaCl agglomerates (aqua), Ca-S agglomerates (orange) in a) summer 2008, b) summer 2009, and c) winter 2010. Columns provide geographic segregation of size distributions with average across all sites (column 1), sites in the Cleveland Flats (column 2), Rest of Cleveland (column 3), and Medina (column 4). Inset upper right is a topographic map of the Cleveland area with different sites color coded by category: Flats (red), Rest of Cleveland (blue), Medina (green). For a detailed map of sources and sites in Cleveland see refs. Adv. Note: Medina site was not used in 2008.



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Brief:

Sources, spatial distribution, and atmospheric processing of natural and anthropogenic ironcontaining particles are shown for the Cleveland, Ohio urban airshed.

TOC - Graphic

