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## **A mineralogical and chemical investigation of road dust in Philadelphia, PA, USA**

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## **Abstract**

Road dust was investigated within Philadelphia, a major United States city with a long history of industrial activities, in order to determine pollution levels. Almost all of the investigated minor elements were enriched relative to the continental crust. Furthermore, mean concentrations of Cr, Co, Cu, and Pb were high compared to those reported in cities in other countries. Lead pollution should be investigated further in Philadelphia, where 8 of the 30 sample sites, including those heavily trafficked by civilians, were at or above the EPA's child safety threshold for Pb in bare soil. High Spearman correlations between Zn and Cu, Zn and Cr, Cu and Cr, and Sn and V, as well as factor analysis of minor elements suggest that the primary sources of these elements were anthropogenic. Potential sources included the breakdown of alloys, non-exhaust traffic emissions, paint, smelting, and industry. We found that higher organic content in road dust may be related to higher traffic densities, which could be due to tire-wear particles. Additionally, higher mean concentrations of Fe, Cr, Cu, and Zn were found at sites with elevated traffic densities. Land use impacted some of the elements not influenced by traffic density, including Co, Sn, and Pb. Bulk mineral content was similar across different land uses and traffic densities and, thus, did not appear to be influenced by these factors. Our research emphasized the complexity of road dust and utilized a more comprehensive approach than many previous studies. This study established fundamental groundwork for future risk assessment in Philadelphia, as it identified several key pollutants in the city. Overall, this assessment serves as an informative reference point for other formerly heavily industrialized cities in the United States and abroad.

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## **Keywords**

heavy-metal pollution; industrial legacy; anthropogenic influence; land use; traffic

## **1. Introduction:**

Currently, over half of the world's population resides in urban areas (United Nations, 2012); trends suggest this may climb to 70% by 2050 (United Nations, 2014). The ever-expanding urban space is predicted to increase environmental pollution, creating potential human health hazards (Lim et al., 2012). Road dust can be used as an environmental proxy for exposure to elements considered toxic to human health (Li et al., 2001).

Urban road dust consists of natural and anthropogenic particles that accumulate on impervious outdoor surfaces in metropolitan environments (Shi et al., 2010). Also referred to as urban road sediment or street dust, this medium exists at the interface between the atmosphere and soils, acting as both source and sink for pollutants (Christoforidis and Stamatis, 2009). Various geochemical techniques have been used in road dust studies to determine urban pollution levels, its role as a pollutant accumulator, and its potentially toxic nature (e.g., Li et al., 2016; Robertsen et al., 2003; Wei et al., 2015). Primary sources for road dust include industrial activity, non-exhaust traffic emissions (road and rail traffic), local soils, and local geologic formations (Pant and Harrison, 2013; Thorpe and Harrison, 2008; Varrica et al., 2003).

People interact with urban road dust through three primary pathways: ingestion, epidermal contact, and inhalation (Ferreira-Baptista and De Miguel, 2005). Road dust particles smaller than 100 μm may contribute to air pollution after being resuspended by wind or passing traffic (Zhao et al., 2014). These particles can be inhaled and, if small enough, deposited in the lungs, posing a potential threat to the respiratory system (Brown et al., 2013; Kastury et al., 2017). In general, finer particles are more dangerous because, after inhalation, they travel farther into the human respiratory tract, are more difficult for the body to clear, and may be more bioavailable (Kastury et al., 2017). Ingestion was generally found to be the highest risk pathway for road dust exposure (Shi et al., 2011).

In the past, road dust has been collected for analysis throughout major cities in various settings, including areas of high and low traffic, generally utilizing vacuum systems or polyethylene brushes (e.g., Wei and Yang, 2010; Zhao et al., 2016). Worldwide road dust studies, predominantly those carried out in China, generally assess bulk heavy metal concentrations (e.g., Hu et al., 2011; Li et al., 2001; Lu et al., 2009; Shi et al., 2008; Wei et al., 2015). These studies typically investigate a single component of road dust using specific analytical techniques. Common techniques to compare bulk concentrations of heavy metals in road dust to regulatory standards are inductively coupled plasma-optical emission spectrometry (ICP-OES), inductively coupled plasma-mass spectrometry (ICP-MS), and atomic absorption spectrometry (AAS) (Wei and Yang, 2010). Many studies of urban road dust use these data to create risk indices to assess the impact of environmental pollution (e.g., Shi et al., 2011; Zhao et al., 2016).

O'Shea et al. Page 3

Philadelphia, Pennsylvania is the sixth largest city in the United States (U.S.) with a population of over 1.5 million people. The average temperature of the city is 12.25°C, with an average annual precipitation of 105.28 cm and a dominant wind direction of SW (NOAA, 2019).

Given the city's long and varied industrial history, the accumulation of harmful elements, such as lead (Pb), in road dust are a concern due to their potential health implications. Childhood Pb exposure can result in impaired cognition, diminished intellectual and academic abilities, and higher rates of neurobehavioral disorders (Council on Environmental Health, 2016; Philadelphia Childhood Lead Poisoning Prevention Advisory Group, 2017). The Council on Environmental Health (2016) advocates that the most effective method for combating this problem is to remediate Pb sources. In Philadelphia, two major Pb sources are leaded paint in old buildings and industrial activity, both of which likely contribute to road dust (Lusby et al., 2015). One of the prominent industrial sources of Pb were Pb smelters; at one point, Philadelphia had 36 Pb smelters—which was more than any other city in the U.S. (Ruderman et al., 2017). Lead smelters became important in the 19<sup>th</sup> century and, with the rise of industrialization, were unregulated (Garg and Landrigan, 2002). The smelters became more vital in the  $20<sup>th</sup>$  century as Pb was in high demand for its use in paint, gasoline, Pb-acid batteries, plumbing pipes, and cable wires (Graney et al., 1995; Vermillion et al., 2005). Philadelphia has a complex history of industrial activity, including paint production, chemical processing, locomotive works, textile production, shipbuilding and maintenance, metal working, and tanning (e.g., Scranton, 1989). These activities could have left traces of contamination in local environmental media such as soils (e.g., Lusby et al., 2015). Soils may contribute residues from the previously mentioned industries to road dust if they are disturbed. After World War II, the city's industrial sector declined. Modern Philadelphia features a primarily information- and service-based economy; current key industrial activities include the oil-refinery close to the Philadelphia International Airport and pharmaceutical development (Select Greater Philadelphia Council, 2016).

The local geologic formations, however, likely contribute to the city's road dust as well. The Philadelphia metropolitan area is underlain by three principal geological formations: the Trenton Gravel, the Pennsauken and Bridgeton Formations, and the Wissahickon Formation (WF) (Fig. 1). The WF is primarily composed of oligoclase-mica schist (quartz, micas and plagioclase feldspars) and hornblende gneiss (hornblende, quartz, and feldspars) (Weiss, 1949), but serpentinite (predominantly antigorite, lizardite, and chrysotile, some olivine and pyroxene) and pegmatite (chiefly quartz, feldspars, and micas) occur in some outcrops (Weiss, 1949). The Pennsauken and Bridgeton Formations and the Trenton Gravel contain quartz sand (Paulachok, 1991). The WF has been quarried for decades by local industry, was extensively used in construction within the city, and has exposures throughout Philadelphia.

In this paper, we report data for the mineralogical and chemical composition, particle size, and organic content of road dust in Philadelphia. This suite of analyses allowed us to assess the composition of road dust in a more comprehensive manner than most previous studies. Furthermore, this investigation helped to contextualize previous road dust studies of historically industrial American cities (e.g., Legalley and Krekeler, 2013). Our approach considered several potential sources of road dust, including the local bedrock and industrial

activities. Additionally, we investigated road dust's compositional relationship to different traffic densities and land uses. This research approach built on previous studies, including those of other U.S. cities such as Middletown, Ohio (Dietrich et al., 2018). By adding mineral phases, organic content, and land use to this comparison, our study expands the scope of previous road dust investigations and ultimately represents an environmental hazard investigation of bulk road dust in Philadelphia.

## **2. Methods:**

## **2.1 Sample Sites:**

Thirty sample locations within the metropolitan area of Philadelphia were selected for this study (Fig. 1; Table 1). Sites were classified by the nature of their surroundings and average annual daily traffic (AADT) in order to explore the potential impact of current land use and traffic density on road dust composition (data from Delaware Valley Regional Planning Commission (DVRPC), 2016). We distinguished between Commercial (n=8), Industrial  $(n=5)$ , Park  $(n=6)$ , Residential  $(n=5)$ , and Mixed use  $(n=6)$  settings. Businesses and storefronts were classified as Commercial; factories and similar locales as Industrial; green spaces as Parks; living areas as Residential, and all other sites, including university settings and some higher-traffic streets, as Mixed. Sites were separated into three traffic density categories: Low Traffic (n=6) (ADDT<6,000), Medium Traffic (n=14) (AADT  $6,000-13,000$ , and High Traffic (n=10) (ADDT>13,000). Below, the thirty samples will be collectively referred to as "Philadelphia road dust" (PRD).

#### **2.2 Sample Collection:**

Collection took place between 3:00 a.m. and 8:00 a.m. over a five-week period beginning in October 2016. All sampling took place before roads were winterized in order to avoid the presence of winter weather materials in PRD. Samples were collected using a bag-less handheld vacuum (V-6 Trigger, Dyson, Inc.) held at street level for 7.5 minutes at each site; comparable studies also utilized vacuum systems (Duong and Lee, 2011; Faiz et al., 2009; Zhao and Li, 2013; Zhao et al., 2016). The Dyson's centrifugal technology allowed the vacuum to gather small particles with high efficiency. Samples were collected from a rectangular area, which measured 3 m by the curb-to-curb road width. We vacuumed across the full width of the road to account for potential variation in size and composition of road dust present at the curbs compared to the crown of the road (Zhu et al., 2008). Samples were collected a minimum of seven days after the last rain event (Tanner et al., 2008) to allow particles to accumulate (Egodawatta et al., 2009). Immediately after collection, samples were transferred from the vacuum's dust bin into anti-static polyethylene bags, which were then sealed and stored in the laboratory. All samples were air dried at room temperature, in the laboratory, prior to analysis and sample weight was recorded (Table S1) (Padoan et al., 2017).

## **2.3 Sieving and Loss on Ignition:**

All samples were dry-sieved using an 841-μm stainless steel hand-held sieve utilizing regular, circular motions. Particles that passed through the sieve were collected for analysis. This size range was used because previous studies found that most road dust particles are

 $\leq$ 850 μm across (Duong and Lee, 2011); in addition, the 841-μm mesh size is a standard sieve opening (No. 20 mesh). Furthermore, this sieve size specifically allowed us to remove most visible coarse debris, mainly litter, from our collected samples for bulk assessment. The size range chosen included particles that may have health implications (e.g., Christoforidis and Stamatis, 2009). Organic matter content was estimated using loss on ignition (LOI). Samples (2 g) were weighed using a Sartorius analytical balance before and after being placed in a muffle furnace (Thermolyne model 6000) at 500°C for 8 hours (Ball, 1964). All subsequent analyses were performed on the LOI residue; measured values were reported on the basis of total collected dust weight unless otherwise noted. While it is possible that a small portion of some metals were lost with LOI (e.g., Hg), most did not vaporize given that they (e.g., Cd, Pb, and Zn) were expected to be found primarily as metals with boiling points above 500°C or as oxides with even higher boiling points. Overall, we did not expect to find measurable concentrations of Hg due to the lack of local sources and our instrument's detection limits. Thus, the overall effect was not significant to the interpretation of the study.

#### **2.4 Particle Size and Volume:**

Particle size and distribution were estimated via laser diffraction using a Beckman-Coulter LS 13 320 Particle Size Analyzer following standard operating procedures with sonication, debubbling, degassing, and rinsing. Particle obscuration for each sample was between 25% and 35% to ensure accurate results.

## **2.5 X-ray Diffraction (XRD) and X-ray Fluorescence:**

Samples were powdered for four minutes prior to analysis using a vibratory Ball Mill (Spex) fitted with tungsten carbide vials. Portions of each powdered sample were analyzed with a Panalytical Epsilon-1 Benchtop X-ray Fluorescence Spectrometer. These data were utilized to help identify elements of interest for ICP-OES, for initial statistical analysis, and to provide a first estimate of the total elemental composition (Table S2).

Samples were then packed into 16-mm diameter holders. A Panalytical X'Pert Powder X-ray Diffractometer, equipped with an X'Celerator detector, spinning stage, and a Co-Kα radiation source set to 40 kV and 40 mA, was used to record the XRD pattern of each sample from 5°–80° 2θ. The Panalytical software program Highscore Plus, equipped with the International Centre for Diffraction Data's Powder Diffraction Files-4 database, was used to identify the major phases present. Weight percentage of the mineral phases were estimated using the semi-quantitative reference intensity ratio technique (Hubbard and Snyder, 1988).

## **2.6 Inductively Coupled Plasma-Optical Emission Spectrometry:**

In preparation for ICP-OES, a hydrochloric/nitric acid digest was used to dissolve elements that could become environmentally available (comparable to Method-3050B; United States Environmental Protection Agency (USEPA), 1996); this was similar to mixtures (aqua regia) used in previous studies (e.g., Duong and Lee, 2011; Li et al., 2013; Padoan et al., 2017). This digest was chosen because this study focused on the potential environmental hazard of

O'Shea et al. Page 6

PRD. Approximately 0.3 g of each sample was combined with 8 mL of nitric acid and 2 mL of hydrochloric acid and subsequently heated to 95°C for two hours.

Following digestion, samples were diluted to 500 mL and analyzed via ICP-OES (Genesis, Spectro GMBH). Seventeen pre-selected elements of interest—K, Ca, Na, Zn, Cu, P, Al, Fe, Pb, Ti, Sn, Sb, Cd, Cr, Hg, Co, and V—were analyzed. Six calibration standards (80 ppm, 40 ppm, 20 ppm, 10 ppm, 5 ppm, 1 ppm) and blank standards were created for each element using commercial element standards (SPEX CertiPrep). At least one standard reference material (Montana Soil 2710a; NIST, 2010) was included in each digestion run.

## **2.7 Statistical Analysis:**

Only elements detected at more than half of the sample sites were included in the statistical analyses. Elements were analyzed separately by two groups, major and minor. The major elements Na, Al, P, K, Ca, Ti, and Fe were grouped as they are typical crustal elements that may have primarily geologic sources (Varrica et al., 2003). The minor elements V, Cr, Co, Cu, Zn, Cd, Sn, Sb, Hg, and Pb were combined as they likely have anthropogenic sources (Keshavarzi et al., 2015; Li et al., 2013). Descriptive statistics (mean, median, standard deviation, kurtosis, skewness, and range) were reported to give an overview of the elemental concentrations present in PRD. In this study, mean elemental concentrations were used for comparison with previous road dust investigations. The normality of element distributions was determined using a Shapiro-Wilk test. All elements, aside from Ti, were non-normally distributed. As both normally and non-normally distributed data were present, Spearman's correlation coefficients were calculated to determine the correlations between the concentrations of elements.

Exploratory factor analysis, a multivariate assessment, followed by a varimax rotation was used to analyze the correlation in bulk elemental concentration of the samples. Below, this was simply referred to as factor analysis for simplicity. Similar studies have also utilized factor analysis (e.g., Žibret et al., 2013). The factors were estimated using the iterated principal factor method based on the Spearman correlation matrices directly instead of using the concentrations on the original scale because most elements were non-normally distributed. The enrichment of PRD relative to the continental crust and to the WF was calculated as the elemental concentration in PRD divided by the elemental concentration in the crust (or WF). The enrichment relative to the continental crust was utilized as a general point of comparison in order to potentially distinguish the sources of elements as being mainly geologic or anthropogenic.

## **3. Results:**

## **3.1 Mineral Phases:**

Nineteen mineral phases were found in PRD (Table 1). XRD results demonstrated that quartz (SiO<sub>2</sub>), dolomite (CaMg(CO<sub>3</sub>)<sub>2</sub>), and anorthite (CaAl<sub>2</sub>Si<sub>2</sub>O<sub>8</sub>) were present at a majority of the sample sites (Table 1), with quartz being ubiquitous. Of the 30 sample sites, 28 contained dolomite, and 20 contained anorthite, a plagioclase feldspar. Albite  $(NaAlSi<sub>3</sub>O<sub>8</sub>)$ , another plagioclase feldspar, was found at 6 of the 30 sample sites. Quartz,

dolomite, and plagioclase feldspars represented the dominant mineralogic components, accounting for  $\epsilon$  64 wt% of the crystalline material in PRD (Table 1; Fig. 2). The clay minerals illite  $((K, H_3O)(A1, Mg, Fe)_{2}(Si, Al)_{4}O_{10}[(OH)_2,(H_2O)]$  and halloysite  $(Al<sub>2</sub>Si<sub>2</sub>O<sub>5</sub>(OH)<sub>4</sub>)$  were each found at 4 different sample sites. Other identified mineral phases included magnetite (Fe<sub>3</sub>O<sub>4</sub>) and hematite (Fe<sub>2</sub>O<sub>3</sub>). Muscovite (KAl<sub>2</sub>(AlSi<sub>3</sub>O<sub>10</sub>)  $(F, OH)$ ) was found at one sample site and was distinguished from illite as muscovite flakes were visible within the individual sample.

#### **3.2 Elemental Composition:**

Of the major elements, the highest concentrations were observed for Al, Ca, and Fe (0.78, 2.58, and 4.41 wt%, respectively) (Table 2). Mean and median values were similar for each of the major elements except for Fe, with a mean value of 4.41 wt% compared to a median 3.97 wt%.

The highest mean values for minor elements, 588 and 577 ppm, were observed for Zn and Sn, respectively (Table 3). The mean concentration of Pb in PRD was 516 ppm. Copper, Zn, Sn and Pb had large differences in mean and median values, as well as the highest standard deviations from the mean. The elements Cd, Sb, and Hg were all below the detection limit of the ICP-OES and thus not discussed in the manuscript herein (Table S1).

#### **3.3 Elemental Composition by Land Use:**

The mean concentrations of the major elements Al, P, and Ti were similar across different land uses (Fig. 3a, Fig. 3b), whereas mean Ca concentrations varied somewhat, with the highest value recorded in Commercial areas (3.04 wt%). The greatest mean concentration of K was in Park settings (0.47 wt%). The highest mean concentration of Fe was also observed at Park sites (6.29 wt%), whereas the lowest value was found in Residential settings (2.09 wt %). The highest mean Na concentration was at Mixed land use sites (0.25 wt%), and the lowest mean concentration (0.12 wt%) was at Residential sites. Residential sites had the lowest mean concentrations for all of the major elements.

Mean concentrations of V were similar across different land uses, whereas those of Cr, Co, Cu, Zn, Sn, and Pb changed (Fig. 3c). The highest mean concentrations of Co and Pb (489 and 1,575 ppm, respectively) were observed in Residential and Industrial areas, respectively, whereas they were lowest in Parks (262 ppm) for Co and lowest in Mixed areas for Pb (256 ppm). The highest mean concentrations of Sn and Cr (1,801 and 218 ppm, respectively) were in Parks.

#### **3.4 Mineral Phases by Land Use:**

Quartz was ubiquitous across all sites (Table 1), and thus, land uses (Fig. 4). The occurrence of dolomite was nearly ubiquitous. Anorthite was present most often at Residential sites (4 of 5) and the least at Mixed sites (3 of 6). Albite was present at 2 of 6 Mixed sites and no Residential sites. Overall, illite, calcite, hematite, and halloysite were found at too few sites to establish any relation to land use.

## **3.5 Elemental Composition by Traffic:**

The mean concentrations of Na, Al, P, K, and Ti were similar across different traffic densities (Fig. 5a, Fig. 5b). Mean Fe concentrations showed distinct variation with traffic density, with the highest value at High-Traffic sites (5.64 wt%), and the lowest (2.11 wt%) at Low-Traffic sites. A higher mean Ca concentration was found for Medium-Traffic sites (2.76 wt%) than for Low-Traffic sites (2.11 wt%).

The mean concentrations of V were similar across all traffic densities, but those of all other minor elements varied with traffic density (Fig. 5c). The highest mean concentrations of Co, Sn, and Pb (584, 1,745, and 1,241 ppm, respectively) were associated with Low-Traffic sites. Conversely, the highest mean concentrations of Cr, Cu, and Zn (151, 508, and 766 ppm, respectively) were at High-Traffic sites.

#### **3.6 Mineral Phases by Traffic:**

Quartz was present at all sites regardless of traffic density (Fig. 6). Dolomite was present at all Medium- and High-Traffic sites, and at 4 of 6 Low-Traffic sites. Anorthite and albite, whether considered together or separately, did not seem to vary with traffic density. Calcite and hematite were absent from Low-Traffic sites, but both were present at 4 of the highertraffic sites. Illite and halloysite were found at too few sites to establish any relation to traffic.

#### **3.7 Statistical Analysis of Elemental Data:**

The strongest statistically significant  $(P<0.05)$  Spearman correlations of major elements were observed between K and Na (0.82), P and Na (0.72), K and P (0.66), and Fe and Na (0.63) (Table 4). The strongest statistically significant Spearman correlations of minor elements were between Zn and Cu (0.64), Zn and Cr (0.50), Cu and Cr (0.49), and Sn and V (0.48) (Table 5). For completeness, the Spearman correlations between all elements were also calculated (Table S3).

Factor analysis of the major elements in PRD revealed that three factors explained 88.18% of the cumulative variance (Table 6). Factor 1 was primarily composed of Na and K, Factor 2 was explained by Ca, Ti, and Fe, and Factor 3 by Al and P. Factor analysis of the minor elements revealed four factors, which explained 91.27% of the cumulative variance. Factor 1 was characterized by Cr, Cu, and Zn, Factor 2 by V and Cr, Factor 3 by Pb, and Factor 4 by Sn (Table 7).

#### **3.8 Particle Size and Volume, and Organics:**

Samples exhibited a large range in particle size (Fig. 7); the mean size across all 30 sample sites was 466 μm. Approximately 25% of the cumulative volume was smaller than 200 μm, and 10% was smaller than 100 μm.

Mean organic concentrations ranged from 2.49 wt% in Industrial areas to 10.15 wt% in Mixed areas, which also exhibited the largest range (19.07 wt%) (Fig. 8). Low-Traffic areas had the lowest mean organic concentration (3.77 wt%) (Fig. 9), whereas the mean organic concentrations in Medium- and High-Traffic sites were 6.43 and 7.54 wt%, respectively.

## **4. Discussion:**

#### **4.1 Minerals:**

Quartz, the feldspars anorthite and albite, as well as a variety of other phases present at less than four sample sites (mica, augite, almandine, phlogopite, and diopside) likely stem from the WF. Dolomite and calcite could come from sidewalk, road, and construction materials; asphalt could also contribute to dolomite and albite (Table 1). Illite and halloysite are common clay minerals that could be derived from local soils. The few phases unrelated to local formations could be anthropogenic. Magnetite is known to be associated with coal fly ash, the corrosion of vehicles and brake wear, and the abrasion of rails (Gieré et al., 2003; Grigoratos and Martini, 2015; Matzka and Maher, 1999). A previous study in Barcelona has found that the presence of hematite in urban areas may be due to the abrasion of railways (Querol et al., 2012).

The overall mineralogical composition of PRD was similar to the results reported by Legalley and Krekeler (2013) for road dust in Hamilton, Ohio. The bulk mineralogic composition of PRD was relatively consistent across sample sites, irrespective of traffic density, and as such, we concluded that the mineral phases present in PRD were not linked to traffic density. Similarly, land use was not connected to PRD's mineralogic composition.

#### **4.2 Major Elements:**

Relative to the mean continental crust (Rudnick and Gao, 2003), PRD was depleted in all major elements (mean values), except for P, which exhibited an enrichment factor (EF) of 1.6 (Table 8). The mean Fe concentration of PRD was similar to that of the continental crust  $(EF = 0.8)$ , whereas the mean Na, Al, K, and Ti contents were considerably lower. When normalized to the average WF composition (Weiss, 1949), PRD was found to be enriched in P (2.2), Ca (3.6), and Fe (2.0) (Fig. 10), suggesting that the local bedrock was not the only source for these elements. Philadelphia road dust was depleted relative to the WF in Na  $(0.1)$ , Al  $(0.1)$ , K $(0.2)$ , and Ti  $(0.1)$  (Fig. 10); despite the depletion, one source of these elements may still be the WF as the difference in extractable concentrations, using our methods, versus total concentrations used by Weiss (1949) must be considered. Furthermore, the depleted elements, aside from Ti, may be more readily leached and transported. With factor analysis, Factor 1 was accounted for by Na and K (Table 6), and may be sourced to the WF. Thus, over 31% of the variance in major element concentration could be from the WF. The strongest Spearman correlation was also connected to Na and K (0.82) (Table 4), which could reflect the high percentages of feldspars and micas in the WF (Weiss, 1949). Factor 3 was primarily associated with P, as well as Al, and the source was unclear.

Land use did not appear to impact the concentrations of Al, P, and Ti. However, land use may impact concentrations of Na, Ca, K, and Fe, which could have had mixed sources from local bedrock (e.g., WF), soil, and anthropogenic activity. Only the mean concentrations of Ca and Fe changed with both land use and traffic density (Fig. 3b; Fig. 5b).

Previous studies have correlated Fe in road dust to traffic due to brake wear (Apeagyei et al., 2011). Factor 2 is primarily associated with Fe, and could have mixed anthropogenic (e.g., Apeagyei et al., 2011) and natural sources as this factor, which accounted for over 30% of

O'Shea et al. Page 10

variance, was also related to Ca and Ti. Both Ca and Ti may be associated with brake pads (Sommer et al., 2018) (Table 6). Thus, much of this variance could be traffic-related, specifically as Fe increased in mean concentration with higher traffic densities (Fig. 5b).

High-Traffic sites had higher mean organic concentration (Fig. 9). Higher traffic may increase the organic concentration of road dust by adding increasing amounts of tireabrasion particles; however, as noted by Sommer et al. (2018), traffic volume is not the only factor relevant in creating these particles. A follow-up study, utilizing scanning electron microscopy (SEM) to investigate tire wear in PRD, could be valuable for better understanding this aspect of our study. We originally hypothesized that the highest mean organic matter concentration would be found in Park settings and the lowest in Industrial areas. Whereas this was true for Industrial areas, it was not for Parks (Fig. 8).

#### **4.3 Minor Elements (comparisons):**

All of the minor elements analyzed in PRD were enriched, some to a considerable extent, relative to the mean continental crust (Table 9), except for Cr (EF of 0.9) and V (EF of 0.3). The highest EF was observed for Sn (339.4), followed by Pb (46.9). High enrichment factors were also found for Co (13.3) and Cu (13.9) (Table 9). Furthermore, the mean concentrations of Co, Cu and Pb in PRD were enriched relative to the international road dust average (approximately 10x, 2.5x, and 2x, respectively) (Table 10). The mean concentration of Pb in the PRD samples (516 ppm) was the second highest of the cities studied. There were eight sample sites in Philadelphia at or above the EPA's threshold for Pb in bare soil that children can safely interact with (400 ppm), which emphasized potential health risks associated with human interaction (Table S1) (Council on Environmental Health, 2016).

The maximum values of Co and Pb (1,131 and 6,147 ppm, respectively) in PRD were higher than those reported in other cities studied (Table 11). The maximum Co concentration was nearly twenty times greater than the next highest reported value of 64 ppm from Witbank, South Africa (Žibret, 2013), whereas the maximum Pb concentration was more than twice the next highest concentration (3,060 ppm), reported for Xi'an, China (Yongming, 2006). These extreme values for Co and Pb were both recorded at sample site 26 (see Fig. 1 and Table S1), which also contained more Zn (3,025 ppm) than any other site in Philadelphia. Sample site 26 is close to the Philadelphia International Airport (Fig. 1), in an area that has historically been used for industrial and military activity; the context of the area could account for the extreme values found. The maximum value of Fe (12.34 wt%) in PRD was the second highest value reported for any other compared city and was recorded at sample site 18 (Table S1). The maximum values of Cr and Cu (645 and 1,478 ppm, respectively) in PRD, detected at sample sites 19 and 21, were the third highest values reported for any other compared city. Sites 18, 19, and 21 were all on busy (>12,000 AADT) roads that featured significant stop-and-go traffic; thus, high traffic activity could account for the high concentrations of traffic-related elements found at these sites. However, it was important to note that a single maximum concentration was not representative of the overall urban environment.

Relative to one study in Hamilton, Ohio, a historically industrial city, PRD contained higher mean concentrations of Cr, Cu, and Pb (LeGalley and Krekeler, 2013), but the Zn

concentrations were nearly identical (Philadelphia 588 ppm; Hamilton 589 ppm) (Table 10). Compared to Middletown, Ohio, a typical post-industrial Midwestern city noted for its steel production, PRD had higher mean Cu, Zn, and Pb concentrations (Dietrich et al., 2018), but lower mean Cr (119 ppm vs. 160 ppm) and Fe (4.41 wt% vs. 5.18 wt%) (Table 2; Table 10). Samples from the Dietrich et al., 2018 study were primarily collected in a parking lot close to an industrial source. Furthermore, their study tested all particle sizes. The Hamilton study was also a bulk assessment, but for particles <2 mm. Thus, the methods utilized could account for some of the observed differences between studies. The general results of our study were consistent with Philadelphia's expected profile, derived from its long industrial history and former use of leaded paint and gasoline (Lusby et al., 2015; Philadelphia Childhood Lead Poisoning Prevention Advisory Group, 2017). As discussed in the introduction, the large number of smelters as well as the high concentration of industrial activities, such as metal working, tanning, and shipbuilding, may also contribute to the contamination found today. Furthermore, the lack of overall regulation on the Pb smelters, when many of them were active, could also have played a role in Pb deposition (Lusby et al., 2015). Overall, the generally high concentrations of most metals, compared to continental crust, nationally, and internationally, highlighted Philadelphia's high metal accumulation from anthropogenic activities.

## **4.4 Minor Elements (sources - primarily traffic related):**

The primary source of Cr, Cu, and Zn could be due to traffic-related activity, as other studies have connected these elements to metal corrosion of vehicles, brake wear, and tire abrasion, respectively (e.g., Amato et al., 2009; El Samrani et al., 2004; Liu et al., 2014; Lough et al., 2005; Smolders and Degryse, 2002; Thorpe and Harrison, 2008). Other sources of anthropogenic Cr found in previous studies include emissions from industrial plants, Cr-steel production, tanneries, coal combustion, as well as yellow paint, including that used for yellow road markings, containing PbCrO4 (Huang et al., 2009; Legalley and Krekeler, 2013; Manno et al., 2006; Sedlazeck et al., 2017; White et al., 2014). Another potential source of Cu is industrial activity such as smelting (e.g., Zhang et al., 2009). Other sources of Zn include coal combustion, waste incineration, mining, and steel processing (e.g, Zhang et al., 2012). In addition to Fe, the highest mean concentrations of Cr, Cu, and Zn (151, 508, and 766 ppm, respectively) were found at High-Traffic sites, and their mean concentrations generally increased with traffic activity (Fig. 5c). Moreover, many of the highest Spearman correlations were likely indicative of traffic activity (Table 5) (Apeagyei et al., 2011; Padoan et al., 2017). Of the significant Spearman correlations, the correlation between Zn and Cu could be associated with the use of brass and the abrasion of brake pads, and the correlation of Cu with Cr to vehicle wear (Table 5) (e.g., Padoan et al., 2017). When all elements were compared, there were a number of significant Spearman correlations between Fe and trafficrelated minor elements (Cr, Cu, and Zn), which could demonstrate the influence of traffic activity (Table S3). Furthermore, with factor analysis, Factor 1 was characterized by Cr, Cu, and Zn (Table 7), which accounted for nearly 36% of the variance associated with minor elements, and further demonstrated traffic as a major source of PRD. Chromium, Cu, and Zn were found at their highest mean concentrations at Park and Mixed land-use settings (Fig. 3c); generally, land use did not appear to have a major influence on these elements.

## **4.5 Minor Elements (sources - primarily non-traffic related):**

The remaining non-traffic associated minor elements, V, Co, Sn, and Pb, were likely anthropogenically sourced as past studies have ascribed these elements to anthropogenic activity (e.g., Barceloux & Barceloux, 1999; Domingo, 1989; Lusby et al., 2015; Žibret et al., 2013). Previous studies have found that V may be associated with steel production, alloys, catalysts, or in yellow paint pigments or ceramics (e.g., Barceloux & Barceloux, 1999). Many of these sources, including paint pigments, steel wear, and alloys, may be represented in PRD as Factor 2, primarily V, accounted for over 23% of variance of minor elements (Table 7). The disturbance of soils where V was deposited by former Philadelphia industry could be largely responsible for Factor 2 in PRD. Other studies have found Co as a byproduct of smelting (Domingo, 1989). Lead, Factor  $3$  ( $>17\%$  of the variance), may have been associated with the erosion of old Pb paint and to the former Pb smelters in Philadelphia (e.g., Lusby et al., 2015). Tin, primarily represented by Factor 4, accounted for approximately 15% of the variance in minor elements (Table 7), and could have stemmed from a variety of sources, ranging from can coatings, solder, and ceramics, to the burning of fossil fuels (e.g., Žibret et al., 2013). Overall, many industrial sources are not easily distinguished from one another and thus, much of the variance in the study was simply attributed to industrial activity overall.

Land use may have influenced some of the minor non-traffic related elements (Co, Sn, and Pb). Some elements, such as Pb, were found at their highest mean concentrations in areas where they were likely produced (Industrial) (Fig. 3c); however, this was not the case for other elements like V, Co, and Sn (see Fig. 3c). A possible explanation for this could be the transportation of PRD across different land uses.

In the future, we plan to analyze a smaller size fraction of road dust in order to better understand the potential human health impacts of the minor elements.

## **5. Conclusions:**

The wide variety of analytical methods utilized in this study generated a broader and more complete data set for road dust than most previous studies. The results emphasize the chemical heterogeneity of road dust and improve our ability to distinguish between the natural and anthropogenic sources that contributed to PRD. We recommend utilizing this suite of analytical methods in future road dust assessments.

Our study highlighted Philadelphia's expected profile as a polluted area with high metal concentrations, both in a national and international context, due to the city's long and varied industrial legacy. Critically, eight sample sites had potentially harmful (≥ 400 ppm) concentrations of Pb. Some of these sites (sites 1 and 2) are close to the city's historic district, near the Liberty Bell, where pedestrians, including children, may interact with the road dust. Another site above the Pb threshold is the Walnut Street Bridge (site 21), where there is also a large amount of pedestrian traffic. Overall, we generally recommend that industrial areas must be remediated before future residential development takes place due to the high concentrations of Pb found at Industrial settings.

O'Shea et al. Page 13

Traffic played a key role as a source of PRD, as it likely provided the elements Fe, Cr, Cu, and Zn, as implied by factor analysis and Spearman correlations. Philadelphia road dust also contained high concentrations of Fe, Cr, Cu, and Pb compared to road dust internationally. Overall, land use did not seem to have a strong impact on these elements. Traffic density must be considered in future city efforts to study road dust and other environmental media, due to the potential for traffic-related metal accumulation. Mean organic concentrations were higher at High-Traffic sites, likely stemming from tire-abrasion particles, which are an environmentally relevant concern.

Due to the nearly ubiquitous local geologic formation (WF), the bulk mineralogic content did not vary much across different land uses and traffic densities throughout the city. This demonstrates that, by considering the local bedrock geology, a majority of the mineralogic components of road dust may be predicted and accounted for—particularly those with resilient phases such as quartz.

This study adds to the growing body of international literature on road dust compositions and sources in the urban environment (e.g., Padoan et al., 2017; Wei and Yang, 2010; Wei et al., 2015). Furthermore, this investigation laid the groundwork for future risk assessment in Philadelphia. It also added context to previous studies of American cities (e.g., Apeagyei et al., 2011; Dietrich et al., 2018; LeGalley and Krekeler, 2013), serving as an additional point of reference as a historically industrial U.S. city. Future studies of PRD should include SEM examinations of road dust particles in relation to hypothesized sources.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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O'Shea et al. Page 18

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O'Shea et al. Page 19



## **Fig. 1.**

Locations of road dust sampling sites in Philadelphia. Overlay colors are the local geological formations according to the Pennsylvania Geologic Survey (2018). Map created in ArcGIS (Esri, 2017)

O'Shea et al. Page 20





Representative diffractogram showing the most common mineral phases that were identified via X-ray diffraction. Example shown is from site 24

O'Shea et al. Page 21



## **Fig. 3a.**

Box and whisker plots of major element (Na, P, K, Ti) concentrations (wt%) categorized by land use. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers (1.5x below the 1<sup>st</sup> quartile or 1.5x above the  $3<sup>rd</sup>$  quartile)

O'Shea et al. Page 22



#### **Fig. 3b.**

Box and whisker plots of major element (Al, Ca, Fe) concentrations (wt%) categorized by land use. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers (1.5x below the 1<sup>st</sup> quartile or 1.5x above the  $3<sup>rd</sup>$  quartile)

O'Shea et al. Page 23



## **Fig. 3c.**

Box and whisker plots of minor element concentrations (ppm) categorized by land use. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers (1.5x below the 1<sup>st</sup> quartile or 1.5x above the 3<sup>rd</sup> quartile). The graph truncates at 3,500 ppm for clarity, omitting a Pb outlier of 6,147 ppm and Sn outlier of 9,339 ppm

O'Shea et al. Page 24

Land Use



## **Fig. 4.**

Mineral phases present at sample sites categorized by land use. Only phases present at 4 or more sites are shown

O'Shea et al. Page 25



#### **Fig. 5a.**

Box and whisker plots of major element (Na, P, K, Ti) concentrations (wt%) categorized by traffic density. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers (1.5x below the 1st quartile or 1.5x above the 3rd quartile)

O'Shea et al. Page 26



## **Fig. 5b.**

Box and whisker plots of major element (Al, Ca, Fe) concentrations (wt%) categorized by traffic density. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers (1.5x below the 1<sup>st</sup> quartile or 1.5x above the  $3<sup>rd</sup>$  quartile)

O'Shea et al. Page 27



## **Fig. 5c.**

Box and whisker plots of minor element concentrations (ppm) categorized by traffic density. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers (1.5x below the 1<sup>st</sup> quartile or 1.5x above the 3<sup>rd</sup> quartile). The graph truncates at 3,500 ppm for clarity, omitting a Pb outlier of 6,147 ppm and Sn outlier of 9,339 ppm

O'Shea et al. Page 28



## **Fig. 6.**

Mineral phases present at sample sites categorized by traffic density. Only phases present at 4 or more sites are shown

O'Shea et al. Page 29



## **Fig. 7.**

Averaged particle size distribution of all 30 sample sites. Standard volume per size fraction (blue curve) is labeled on the y-axis to the left, whereas the cumulative volume (orange curve) is labeled on the y-axis to the right; standard deviation is provided for each data point (black lines)

O'Shea et al. Page 30



## **Fig. 8.**

Box and whisker plot of LOI results (in wt%) categorized by land use. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers  $(1.5x$  below the 1<sup>st</sup> quartile or 1.5x above the 3<sup>rd</sup> quartile)

O'Shea et al. Page 31



## **Fig. 9.**

Box and whisker plot of LOI results (in wt%) categorized by traffic density. The x represents mean value, whereas the horizontal line is median value. All points outside of the box (IQR) and whiskers (min. and max. values – excluding outliers) are outliers  $(1.5x$  below the 1<sup>st</sup> quartile or 1.5x above the 3rd quartile)

O'Shea et al. Page 32



## **Fig. 10.**

The range of Na, Al, P, K, Ca, Ti and Fe concentrations (highlighted in blue, bounded by top and bottom black lines) in PRD normalized to their respective average concentrations in the WF (Weiss, 1949). Black dots and their corresponding black bars represent the mean, normalized by the mean WF, and standard deviation of the PRD concentrations, respectively

Sample site coordinates, brief site description, and mineral phases identified (wt%) at each site.





Descriptive statistics of the selected major elements found in PRD, reported on the basis of total collected dust weight (in wt%). IQR stands for interquartile range.



Descriptive statistics of selected minor elements found in PRD, reported on the basis of total collected dust weight (in ppm). IQR stands for interquartile range. Cadmium, Sb, and Hg were belowthe detection limit (1.5, 30, and 16.5 ppm, respectively).



Spearman correlations of major elements. Statistical significance (P<0.05) is shown in bold.



Spearman correlations of minor elements detected at more than half of the sample sites. Statistical significance (P<0.05) is shown in bold.



Factor analysis results of PRD for major elements. Only elements with factor loadings >0.40 are listed.



Factor analysis results of PRD for minor elements detected at more than half of the sample sites. Only elements with factor loadings >0.40 are listed.



Mean major element concentrations in PRD normalized to continental crust (Rudnick and Gao, 2003).



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Mean minor element concentrations in PRD normalized to continental crust (Rudnick and Gao, 2003).



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International comparison of selected element concentrations (in ppm)in PRD with those reported in previous studies.





\* = Composition of primary digestion, see manuscripts for Hg digestive fluids and all details

Highest concentrations of selected elements reported in comparable road dust studies.



 $\alpha$ <sup>2</sup> = X-ray fluorescence

 $b$  = Flame atomic absorption spectrometry

\* = Composition of primary digestion, see manuscripts for Hg digestive fluids and all details