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1	Assessment of the PM2.5 oxidative potential in a coastal industrial city in Northern
2	France: relationships with chemical composition, local emissions and long range sources
3	
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10	
11	Abstract
12	The objective of this work was to relate $PM_{2.5}$ Oxidative Potential (OP) data to PM
13	composition and PM local and distant source contributions. PM _{2.5} collected in Dunkerque, a
14	coastal industrial city in North of France, was extensively characterized for major and minor
15	chemical species. PM _{2.5} filters were extracted using a synthetic pulmonary fluid to achieve OP
16	estimation based on Ascorbic Acid (AA) and dithiothreitol (DTT) depletion assays. In order
17	to evidence relationships between OP values, chemical composition and local and distant
18	source contributions, correlation coefficient, Principal Component Analysis (PCA),
19	concentration roses and polar plots and concentration weighted trajectories were used.
20	Heterogeneous conclusions were drawn using the three first methods as the bivariate polar
21	plots lead to dismiss some of the correlation evidenced using correlation coefficient and PCA.
22	Both AA and DTT tests appeared complementary as they were not sensitive to the same
23	species/source contribution. The bivariate polar plot representation of OP values versus wind
24	direction and wind speed revealed that $PM_{2.5}$ concentration and combustion sources were
25	linked to OP-AA, whereas emissions from integrated steelworks, electric steelworks, heavy

fuel oil combustion and traffic non-exhaust significantly contribute to OP-DTT.Sea-salts, aged sea-salts, crustal, secondary sulfates and secondary nitrates sources were not found to contribute to OP values. Constant weighted trajectories evidenced several source regions responsible for high OP values with Belgium, Germany and Netherland at the leader position. Contribution of inland regions appeared possibly related to the biomass and traffic related combustion while heavy fuel oil combustion could be also involved in the contribution of marine and coastal areas.

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34 Keywords: PM_{2.5}; source contribution; oxidative potential; dithiothreitol (DTT) assay; acid

35 ascorbic (AA) assay, concentration weighted trajectories (CWT)

36

37 Introduction

38 Exposure to particulate matter (PM) is a major public health issue for all countries in the world. Air quality modelling has revealed that 91% of the global population lives in areas 39 40 where annual average concentration of PM_{2.5} (particulate matter with an equivalent 41 aerodynamic diameter less than 2.5 µm) exceeds the corresponding WHO guideline limits $(10 \,\mu g \cdot m^{-3})$ (WHO, 2018). Exposure to the outdoor fine particles has been identified as an 42 43 important risk factor of mortality with more than 4.2 million premature deaths in the World in 44 2016 (WHO, 2018). Burnett et al. (2018) applied a new global exposure mortality model to 45 study the association between PM2.5 concentration and non-accidental mortality considering 46 41 cohorts in 16 countries and estimated 8.9 million of PM2.5 related deaths in 2015 (Burnett et al., 2018). It is consistent with the 8.8 million recently modelled by Lelieveld et al. (2020). 47 48 A similar approach applied to the 250 most populates cities in the world predicted a median 49 rate of PM_{2.5}-related mortality reaching 39 per 100,000 people, with differences in the cities 50 (13 to 125 deaths per 100,000 people) (Anenberg et al., 2019).

51 It is well established that particulate matter causes several diseases as lung cancers 52 (Raaschou-Nielsen et al., 2013; Sax et al., 2013), cardiovascular diseases (Massamba et al., 53 2014), chronic obstructive pulmonary disease (COPD) (Li et al., 2016) and asthma (Bontinck 54 et al., 2020; Hendryx et al., 2019). Toxicological studies have shown that PM has the ability 55 to induce oxidative stress. This latter corresponds to an imbalance between the antioxidant 56 defence and the overproduction of reactive oxygen species (ROS) triggered by an exposure to 57 airborne PM. Oxidative stress appears as an early pathways potentially preceding severe 58 damages to cell components (lipids, proteins and DNA) (Borm et al., 2007; Nel, 2005). The 59 PM composition is a determinant of their ability to contribute to overproduce ROS, and both 60 organic compounds and some metals appeared to be associated with ROS production (Kelly 61 and Fussell, 2012).

Components that contribute mostly to PM mass were found to contribute the least to the toxicity (Borm et al., 2007). For this reason, the PM atmospheric concentration is not the only parameter to consider for assessing the impact of air pollution on human health. Indeed, water soluble major ions as ammonium sulfate, ammonium nitrate and sea-salts are relatively not correlated to the PM toxicity whereas trace elements as Pb, Cd, Ni, As and polycyclic aromatic hydrocarbons as benzo[a]pyrene are known for their high toxicity (Lippmann, 2014) and correspond to regulated species in Europe.

69 The assessment of toxicological effects of PM related to the oxidative stress is widely investigated considering in vitro lung cell exposure (Badran et al., 2020; Gualtieri et al., 2017; 70 71 Jia et al., 2017). In parallel, acellular tests have been suggested over the last fifteen years to 72 evaluate the PM oxidative potential (OP), which is a measure of the ability of PM to deplete 73 certain antioxidant molecules in synthetic airway fluids (Ayres et al., 2008; Sauvain et al., 74 2013). The dithiothreitol (DTT) simulates reductant species in cells like Nicotinamide adenine 75 dinucleotide or nicotinamide adenine dinucleotide phosphate. The DTT assay evaluates the 76 ability of PM redox active species to transfer electrons to dissolved molecular oxygen 77 (Kumagai et al., 2002; Li et al., 2003). In the absence of PM redox active species, DTT can 78 act as a reducer of dissolved oxygen leading to formation of H₂O₂. PM components can act as 79 catalyst to increase the reduction of oxygen species to ROS like superoxide anion and H₂O₂. 80 The latter contribute to the overall level of ROS that could be responsible for an oxidative 81 stress in cells. The ascorbic acid (AA) simulates antioxidants in the respiratory tract lining 82 fluid (RTLF) and the AA assay measures the ability of PM to deplete antioxidants in the 83 RTLF (Mudway et al., 2004). The application of DTT and AA assays in many studies showed 84 that they were correlated to both common and different PM constituents. The OP assessed 85 using DTT (OP-DTT) has been correlated not only with metals but also with oxygenated organic compounds (Charrier and Anastasio, 2012; Cho et al., 2005; Crobeddu et al., 2017; 86

87 Verma et al., 2015). The OP derived from AA assay (OP-AA) has been found correlated 88 rather to metals (Fang et al., 2016; Pietrogrande et al., 2018). An OP assessment based on the 89 use of several assays, as AA and DTT in the present study, appears as an appropriate 90 approach for considering contributions of reactive species from several families of PM 91 components. Information on the relationship between PM components and OP values are 92 sometimes limited since the correlation is based on elements that are specific of a source but 93 not always responsible for the OP response (Gao et al., 2020a). In addition, numerous 94 elements and compounds are emitted by different sources and are not always considered at the 95 analysis step. Therefore, several authors have suggested the investigation of PM source 96 contribution to OP (Calas et al., 2019; Cesari et al., 2019; Yu et al., 2019) as a relevant 97 indicator to identify the sources with high potential toxic effects on human health.

In this context, the objective of this study was to relate OP data to PM composition and PM source contribution in an industrial and urban area located in Northern France. The OP-DTT and OP-AA assays were used and relationships between OP results, $PM_{2.5}$ composition and emission sources contributions were investigated by methods including correlation, principal component analysis, bivariate polar plots, concentration roses and concentration weighted trajectories.

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105 1. Materials and methods

106 1.1. PM_{2.5} samples

107 1.1.

1.1.1. Study area and sampling.

 $PM_{2.5}$ samples considered in this work were collected in Dunkerque (latitude: $51^{\circ}2'10''$ N; longitude: $2^{\circ}22'46''$ E) in winter and spring 2010-2011. Since 2010-2011, the $PM_{2.5}$ samples have been stored at -18°C in the dark, in hermetically sealed boxes. This 111 procedure ensures to present any volatilization or transformation of the organic compounds

112 over time. The detailed description of the sampling methodology and the study area is given 113 in Kfoury et al. (2016). Briefly, Dunkergue, 210,000 inhabitants with its suburbs, is an 114 industrialized city located in Northern France in the southern coast of the North-Sea. Due to 115 its location, this site is significantly influenced by common sources as sea spray, marine 116 traffic, domestic and road traffic emissions as well as more specific sources, notably industrial 117 emissions in the field of metallurgy, cement production and organic chemistry. Between the 118 industrial sources, an integrated steelworks (ISW) which is the biggest steel producer in 119 Europe, and an electric steel plant (ESP) are noticeable and located in the 260-290° wind 120 sector and east to the sampling site respectively (Figure S1). According to the European 121 pollutant release and transfer register (E-PRTR), cumulatively in 2010, all the industries 122 located in Dunkerque region emitted in the air 3,100 tons of total suspended particles 123 including 8,117 kg of Zn, 6,962 kg of Pb, 1,398 kg of Ni, 1,241 kg of Cu, 1,194 kg of Cr, 175 124 kg of Cd and 101 kg of As (E-PRTR, 2011). PM_{2.5} was collected on a semi-daily basis (00:00-12:00 UTC and 12:00-24:00 UTC time period) using the high volume $(30 \text{ m}^3 \cdot \text{h}^{-1})$ 125 126 DA80 sampler (DA80, DIGITEL®, Switzerland). Two types of 150 mm diameter filters were 127 used: cellulose (grade 41, Whatman®, GE Healthcare Life Sciences, United Kingdom) for 128 major and trace elements analysis and OP determination, and high purity quartz microfiber 129 filters (grade QM-A, Whatman®, GE Healthcare Life Sciences, United Kingdom) for carbon 130 quantification.

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- 1.2. PM_{2.5} composition and source contribution

PM_{2.5} samples were analyzed for their content in major and trace species as Ag, Al,
As, Ba, Bi, Ca, Cd, Co, Cr, Cu, Fe, K, Mg, Mn, Na, Ni, Pb, Rb, Sb, Sn, Sr, Ti, V, Zn, NH₄⁺,
Cl⁻, NO₃⁻, SO₄²⁻ and total carbon (TC) using Inductively Coupled Plasma-Mass spectrometry
(ICP-MS), Inductively Coupled Plasma Atomic Emission spectroscopy (ICP-AES), ion

chromatography and a CHNS/O elemental analyzer. The detailed protocols are described inKfoury et al. (2016) and Ledoux et al. (2017).

139 In a previous study, constrained weighted-non-negative matrix factorization (CW-140 NMF) was applied to the whole PM_{2.5} composition dataset (173 PM_{2.5} samples) and led to the 141 identification of 11 contributing sources (Kfoury et al., 2016). The eight first ones can be 142 considered as sources typically encountered at an urban coastal site: sea salts, aged sea salts, 143 crustal, heavy fuel oil combustion, combustion 2 (mix between biomass and road traffic 144 combustion) and traffic non-exhaust (related to wear of the car mobile parts such as brakes, 145 tires, clutch ...) for which both a local and distant origin can be considered, and secondary 146 sulfates and secondary nitrates which are typically related to long range transport. Three other 147 source profiles were related to the local steelmaking activities located close to the sampling 148 site (less than 7 km): one for the ESP emissions and two for the ISW sources with a 149 distinction for the latter between the sintering stack (ISW-Sintering Stack) and the fugitive 150 emissions from the whole ISW site (ISW-Fugitive).

In this work, 57 out of the 173 $PM_{2.5}$ samples were considered for studying their oxidative potential. The sample selection was made based on $PM_{2.5}$ concentrations and source contributions. $PM_{2.5}$ samples showing higher relative contribution for each of the eleven sources were included in addition to the high (> 50 µg·m⁻³) and low (<10 µg·m⁻³) $PM_{2.5}$ concentration samples.

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1.3. Oxidative potential measurements

OP was assessed by using two a-cellular methods based on the depletion rate of DTT (OP-DTT) and AA (OP-AA) in the presence of the PM constituent. When performing these tests, an important issue is first related to the choice of the leaching agent that will be used for the PM extraction. The latter has to be representative of the physiological conditions 162 occurring in the PM target organs (Calas et al., 2017; Pietrogrande et al., 2019). As well, the 163 extraction procedure has also an important influence on the OP results and the review of the 164 literature showed large differences between the methods used (Bates et al., 2019). The fact 165 there is no standardized method for OP measurements leads to consider a compromise 166 between all the critical parameters such as solvent, extraction procedure and solid/liquid (S/L) 167 ratio (Hernandez-Pellon et al., 2018).

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1.3.1. Sample preparation for OP tests

170 The Gamble's solution (pH=7.4) is one of the most used simulated lung fluids (SLF) 171 and represents the interstitial fluid in the deep lung. Therefore, it was chosen as a leaching 172 agent for the PM_{2.5} extraction. The Gamble's solution was daily freshly prepared according to 173 the specifications given in Colombo et al. (2008), using ultrapure water and mixing the stock 174 solutions following the order given in Table S1 (see supplementary materials) to avoid salt 175 precipitation. The citrate was used to simulate proteins that can be found in the lung lining 176 fluid and acetate instead of organic acids (Hedberg et al., 2010; Marques et al., 2011). All 177 chemicals were of analytical grades. The pH of the Gamble's solution was adjusted to 7.4 by 178 adding drop-wise HCl 10% (Wragg and Klinck, 2007) or NaOH 1M (Caboche et al., 2011).

For each of the 57 $PM_{2.5}$ samples, about 1/10 of the cellulose filter, containing an average of 1.40 mg of $PM_{2.5}$, was placed in a 15 mL glass tube with 14 mL of Gamble's solution. The volume was chosen in accordance with real human exposure conditions with respect to the ambient concentration of particles, the inhaled air volume and the pulmonary fluid volume. In these conditions, the S/L ratio was in the 1/500 - 1/50000 range avoiding any risk of saturation and competition between the soluble compounds (Caboche et al., 2011).

185 The extraction tubes were covered with aluminum foil and placed in a heated orbital shaker 186 for 24 h at 37°C, at a speed of 250 oscillations \cdot min⁻¹. Solutions were then filtered on 0.45 µm nylon filters, and the filtrates were placed in flasks, and stored at -20°C until OP analyses.
Blanks were considered by treating several field blank filters with the same protocol as
applied on PM_{2.5} filters.

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191 1.3.2. Dithiothreitol OP test

Redox-active species in PM have the ability to oxidize DTT to DTT disulfide, and catalyze the reduction of oxygen species to ROS like superoxide anion and H_2O_2 . When 5,5-dithio-bis-(2-nitrobenzoic acid) (DNTB) is added, the remaining DTT reacts with DTNB, generating DTT-disulfide and 2-nitro-5-thiobenzoic acid (TNB) (Figure S2). The latter is quantified, by measuring its absorbance at 412 nm, which is also proportional to the remaining quantity of DTT (Visentin et al., 2016).

198 The DTT protocol was optimized in a microplate version which makes easier the 199 consideration of several points (i.e. 7 points in this work) for evaluation of the DTT depletion. 200 DTT and DNTB stock solutions were prepared at a concentration of 0.4 mM and 1.5 mM, 201 respectively, in a phosphate buffer (pH=7.4). Since both solutions are sensitive to light and 202 temperature (Damodaran, 1985; Eyer et al., 2003), they were kept in amber glass vials in the 203 dark at -20°C until use. The OP-DTT measurement was carried out in 96 well black plates 204 with clear flat bottom (Coastar® 3631, Corning Incorporated Life Sciences, USA). 120 µL of 205 potassium phosphate buffer (pH=7.4), and 40 µL of the PM leachate (or blank or positive 206 control) were added in each well. The plate was then placed at 37°C for 10 min under 207 shaking. 25 µL of DTT (0.4 mM) was then added to initiate the oxidation reaction.

The remaining DTT concentration was estimated after 0, 5, 10, 20, 30, 45 and 60 minutes of reaction between PM leachate components and DTT, at 37°C. After each time of reaction, 15 μ L DTNB were then added to each well to convert remaining DTT to TNB. After 10 min at 37°C, the absorbance of TNB was measured at 412 nm (spectrophotometer Multiskan Go, Thermo Fisher Scientific, Finland), and converted to DTT remaining quantity. The DTT depletion rate was calculated using the slope of the curve (linear regression) of remaining DTT versus time. 1.4 naphthoquinone (1.4 NQ), 100 μ M, was used as a positive control and obtained values (1.23 μ M·min⁻¹) were in the range of those obtained in the literature.

217 For each PM_{2.5} sample, OP-DTT values were obtained by correcting the PM_{2.5} filter slope values with the blank filter one. Samples were analyzed in triplicates and the given OP-218 219 DTT values correspond to the arithmetic mean. The relative standard deviation was below 4.1 220 %. The OP-DTT values were finally expressed per unit of mass of PM (OP-DTTm in pmol·min⁻¹· μ g⁻¹) and per unit of air volume (OP-DTTv in nmol·min⁻¹·m⁻³). The first unit can 221 222 be related to the intrinsic OP of 1 µg of emitted PM and will be used to compare OP of the 223 sources. The second one can be related to the intrinsic OP of 1 m³ of the air people breathe 224 and is more adapted for studying the situation (wind direction and air mass origin...) in which 225 the impact on health could be high.

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- 1.3.3. Ascorbic acid OP test

228 AA is present in the lung epithelial lining fluid (ELF), along with other antioxidants 229 like reduced glutathione (GSH), and uric acid (UA). Since AA has the same response, 230 weather in a mixture of these antioxidants or alone, it can be used as a simplified model of the 231 synthetic respiratory tract lining fluid (Zielinski et al., 1999). As for DTT, the redox active 232 species in PM have the ability to oxidize AA to dehydroascorbic acid (Figure S2), and 233 catalyze the formation of ROS by transferring an electron to oxygen molecules. AA stock solution (1 mM) was prepared in ultrapure water, and stored at -20°C due to its instability at 234 235 room temperature (Bode et al., 1990). The OP-AA measurement was done in 96 well plates with UV-transparent flat bottom (UV-Star® 655801, Greiner bio-one, Austria). 160 µL of PM 236

237 leachate was placed in each well of the plate, and the latter was heated to 37°C (5 min), before adding 40 µL of AA solution and shaking for 1 min. Finally, the plate was placed in the 238 239 spectrophotometer (Multiskan Go, Thermo Fisher Scientific, Finland), at 37°C and the 240 absorbance was measured at 265 nm every 2 minutes for 2 h (Jung and Wells, 1998) with a 241 30 s shaking step before each measurement (Yang et al., 2014). OP-AA values were deduced 242 from the AA depletion curve versus time considering the slope of the linear part of the curve, 243 where AA depletion rate is maximal. Samples were analyzed in triplicates (RSD $\leq 3.7 \%$), 244 blank filters were considered, 1.4 NQ was used as positive control (2.74 µM·min⁻¹) and OP-245 AA values were expressed per unit of mass of PM and volume (OP-AAm and OP-AAv 246 respectively).

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249 1.4. Data handling and processing

Relationships between OP results, PM_{2.5} composition and source contributions were investigated by using several methods including correlation, principal component analysis (PCA), bivariate polar plots, concentration roses, OP roses and concentration weighted trajectories (CWT). The R software was used in addition to FactomineR (Lê et al., 2008) and openair (Carslaw and Ropkins, 2012) packages to perform these calculations.

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256 1.4.1. Correlation

257 Prior the determination of the correlation coefficient between the variables under 258 study, the Shapiro-Wilk test was performed to assess the normality of the data distribution. As 259 the normality was not verified (p < 0.001) for most of the variables, the Spearman correlation 260 coefficient was used. Two levels of significance were considered, p < 0.05 and p < 0.001, 261

allowing to conclude about the correlation with 95% and 99.9% of confidence respectively. In addition, correlations were also investigated by using PCA after data normalization.

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264 1.4.2. Bivariate polar plots and concentrations roses.

265 Bivariate polar plots and OP and concentration roses were used to investigate the 266 relationships between OP values and contribution of local sources.

Bivariate polar plots represent the variation of a quantitative parameter (concentration, OP value, source contribution) versus the wind direction and wind speed. For each PM_{2.5} sample, the parameter values obtained for the 12 h period were distributed in front of the 12 corresponding hourly wind speed and directions. The data set used to draw each polar plot counts 57x12 lines. The OP and concentration roses, which give the average value in a particular wind direction, were calculated using the same dataset after averaging the values at 45° intervals.

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275 1.4.3. Concentration weighted trajectories

The concentration weighted trajectories (CWT) (Cheng et al., 2013; Dimitriou et al., 2015) were used to investigate relationships between OP and distant sources. The CWT methods assume that when an air mass is passing through a polluted area, the material can be transported along the trajectory to the receptor site. By using air mass back-trajectories and affecting values observed at the receptor site along the trajectories, it is possible, by the end after averaging, to locate areas responsible for high values (Carslaw, 2019).

Air mass back-trajectories were calculated using the hybrid single particles Lagrangian integrated trajectory (HYSPLIT) model (Rolph et al., 2017; Stein et al., 2015) considering the Gridded Meteorological Data Archives (GDAS 0.5 degrees) and a height of 100 meters above ground level at receptor site. For each PM_{2.5} sample, four 72 h backward trajectories were assigned (one trajectory every 3 hours) and OP and source contribution values obtained for
the 12 hours period were merged with the 4 corresponding trajectories. The dataset used for
CWT calculation count 72x4x57 lines.

289

290 2. Results and discussion

291

2.1. PM_{2.5} composition et sources contribution

292 Table 1 regroups the average composition of the PM_{2.5} samples and Table 2 293 summarizes the chemical markers that were used for identifying the sources as well as their 294 average contributions (Kfoury et al., 2016). The PM_{2.5} average concentration of the selected samples was 29.2 μ g·m⁻³, which is similar to the average concentration typically encountered 295 296 during the winter-spring period in the studied area (Kfoury et al., 2016). Among the PM components, NO₃⁻, TC, SO₄²⁻, NH₄⁺, Cl⁻, and Na showed the highest average concentrations 297 298 (> 300 ng·m⁻³) representing together about 67% of the PM_{2.5} mass. These elements appeared 299 characteristics of the secondary nitrate and sulfate source profiles as well as the combustion 300 and the marine sources (Table 2). NH4⁺ and Cl⁻ are also characteristic elements of the ISW 301 sintering stack emissions (Hleis et al., 2013). Fe, K, Ca, Mg and Al were found with 302 concentrations between 26 and 155 ng·m⁻³. These elements are known to belong to the 303 aluminosilicates category. Nevertheless, at Dunkerque urban-industrial site, they were shown 304 to be also associated with emissions from the ISW (Hleis et al., 2013) and notably dusts from the sintering unit. Among the trace metals, Zn (67.6 $ng \cdot m^{-3}$), Pb (14.8 $ng \cdot m^{-3}$) and Mn 305 $(13.7 \text{ ng} \cdot \text{m}^{-3})$ stand out and were mainly associated with the metallurgical activities occurring 306 in the ESP and the ISW (Table 2). 307

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309 2.2. OP-AA and OP-DTT average values

310 The average mass- and volume-normalized OP-DTT and OP-AA values at Dunkerque 311 site are presented together with values published for other European and world sites in 312 Table 3, together with the leaching agents used for extracting PM samples. Ultrapure water, 313 ethanol, methanol, water, phosphate buffer and Gamble solution were used for leaching in 314 addition to ultrasonic treatment or shaking for various times. In one study only, the solution 315 was not filtered after extraction (Janssen et al., 2014). The heterogeneity of the methodologies 316 used could influence the obtained values and could make the comparison not reliable. As the 317 leaching agent is different, the response could also be different as published by Calas et al. 318 (2017) who compared responses in OP_DTT test on extracts obtained by using artificial 319 lysosomal fluid (ALF), ultrapure water, Gamble solution and Gamble solution implemented 320 with dipalmitoylphosphatidylcholine. Based on the analysis of 5 different PM samples, including four real PM samples, it was shown that OP values observed using the ultrapure 321 322 water were always slightly higher than those obtained using the Gamble solution. 323 Nevertheless, focusing on the real PM samples, the difference was not exceeding 13% which 324 make reliable the comparison between values obtained using ultrapure water and Gamble 325 solution. In most of the comparison studies included in table 3, ultrapure water was used as 326 leaching agent. Solubility is also highly dependent of the pH of the leaching agent 327 (Hernandez-Pellon et al., 2018). As the phosphate buffer has the same pH value as the 328 Gamble solution (7.4), we can assume that OP values could be compared without severe bias. 329 However, Jedynska et al. (2017) used methanol as leaching agent and the leachate probably 330 concentrates more organic constituents than leachates obtained using Gamble, water or 331 phosphate buffer. In contrast to the other studies, Janssen et al. (2014) did not filter extracts 332 before testing OP which leads to the inclusion of the contributions of insoluble species in OP 333 values. Consequently, except for Jedynska et al. (2017), who used methanol and Janssen et al.

(2014), we can be confident with the reliability of the comparison between values from thecited papers.

Focusing on values related to $PM_{2.5}$ concentration, the average \pm standard deviation 336 OP-DTTv value, 0.36 ± 0.24 nmol·min⁻¹·m⁻³, appeared in accordance with values observed in 337 338 urban and urban background sites such as Paris (France), Atlanta (USA), Lecce (Italy), 339 (Chirizzi et al., 2017; Gao et al., 2020b; Jedynska et al., 2017; Athens (Greece) 340 Paraskevopoulou et al., 2019). On the other hand, OP-DTTv value is lower than the one 341 determined in Beijing and Hangzhou (China) or in Patalia (India) (Patel and Rastogi, 2018; 342 Wang et al., 2019; Yu et al., 2019). Except for the Netherlands, the corresponding PM_{2.5} concentrations are also far higher (> $113 \mu g \cdot m^{-3}$) than Dunkerque one. The average OP-343 DTTm, $17.7 \pm 15.4 \text{ pmol} \cdot \text{min}^{-1} \cdot \mu \text{g}^{-1}$, OP-AAv, $1.12 \pm 1.15 \text{ nmol} \cdot \text{min}^{-1} \cdot \text{m}^{-3}$ and OP-AAm 344 values, $55 \pm 66 \text{ pmol} \cdot \text{min}^{-1} \cdot \mu \text{g}^{-1}$ were also comparable to the range published for European, 345 346 Asian and American sites.

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348 2.3. Correlation of OP with chemical species and source contributions

In order to study the contribution of PM chemical components to the DTT and AA oxidation activity, the correlation between OP-DTTv and OP-AAv values and the chemical species was investigated based on the Spearman correlation coefficients (Table 4) and PCA (Figure 1 and Table S2).

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2.3.1. Spearman correlation

355 OP-DTTv and OP-AAv showed statistically significant correlation (p < 0.05) with 356 almost all the species under study (Table 4). However, they were not correlated with Ca and 357 Cl⁻, while Al, Co, V were only correlated with OP-DTTv, and Sr only with OP-AAv. Stronger 358 correlations were globally observed between the PM components and OP-DTTv compared to 359 OP-AAv. This latter observation is consistent with results from other research groups (Calas 360 et al., 2019; Fang et al., 2016). In particular, Ag, Al, As, Ba, Bi, Cd, Co, Cr, Cu, Fe, K, Mn, 361 Ni, Pb, Rb, Sb, Sn, Zn, NO₃⁻ and TC showed correlation coefficient higher than 0.6 with OP-362 DTTv. Such a correlation level was observed only for As, Ba, Cu, Na, Pb, Sb, Sn and TC with 363 OP-AAv. A very strong correlation was found between OP-DTTv and Cu (r = 0.85), Cd 364 (r = 0.82) and Sn (r = 0.82).

The major PM components TC, $SO_4^{2-} NO_3^{-}$ and NH_4^+ appeared more correlated with 365 366 OP-DTTv than OP-AAv. This is consistent with the stronger correlation found between PM_{2.5} 367 concentrations and OP-DTTv in comparison with OP-AAv (r = 0.67 versus r = 0.45368 respectively). Our results are in agreement with other observations showing that secondary 369 inorganic aerosols (SIA) components were correlated with OP-DTT (Ma et al., 2018; 370 Paraskevopoulou et al., 2019; Wang et al., 2019). On the contrary, Mg, Na and Sr showed 371 negative correlation coefficients with OP values. These elements are mainly related to the 372 marine influence at the study site. Finally a moderate correlation (r = 0.46, p < 0.001) was 373 found between OP-DTTv and OP-AAv which indicates that the two tests do not exactly 374 respond to the same species and prove the complementarity between both.

375 AA and DTT tests respond to the oxidative species solubilized in the gamble solution 376 after leaching of the collected PM. The leachate includes not only the PM components that 377 were identified and quantified, but also unanalyzed PM species. These latter, such as water 378 soluble organic carbon (WSOC) including humic-like substances (HULIS) or oxygenated 379 PAH, are an integral part of the leachate and also contribute to the OP values as well (Bates et 380 al., 2019; Gao et al., 2020a; Jiang et al., 2020; Lin and Yu, 2019; Ma et al., 2018). In this 381 study, the inorganic PM composition has been investigated and, based on this, the CW-NMF 382 model allowed to determine the source contributions. Consequently, studying the correlation between OP values and source contributions allows indirectly to consider all the speciesincluding the WSOC related to a specific source whether they have been analyzed or not.

385 Strong correlations ($r \ge 0.6$) were found between the "traffic non-exhaust", "secondary 386 nitrates", "ISW fugitive", "ISW sintering stack" and "electric steel plant" sources contribution 387 and OP-DTT values. The three industrial sources are known to emit metals with redox 388 properties (E-PRTR, 2011; Hleis et al., 2013; Kfoury et al., 2016) able to potentiate ROS 389 overproduction. "Secondary sulfates" and "heavy fuel oil combustion" were moderately 390 correlated $(0.4 \le r \le 0.6)$ with only OP-DTTv. Considering the mass normalized data (Table 391 S3 in supplementary materials), OP-DTTm appeared strongly correlated with "ISW fugitive", 392 moderately correlated with "traffic non exhaust", "heavy fuel oil combustion", "crustal" and 393 "ISW sintering stack" while no correlation was found with secondary nitrates and only poor 394 correlation with secondary sulfates (r=0.35). Except for "aged sea-salts" (r = -0.67) and 395 "traffic non-exhaust" (r = 0.66), OP-AAv only showed, at best, moderate correlations with the 396 contribution of each of the 11 sources. Interestingly "sea-salts" and "aged sea-salts" sources 397 show negative correlations with OP-DTTv and OP-AAv values. However, it would be wrong 398 to conclude that emissions related to these sources are able to decrease the OP values. Indeed, 399 in the urban coastal area under study, high marine contributions are associated with high 400 speed winds and favorable condition of dispersion (Ledoux et al., 2006). Consequently, when 401 the marine origin is predominant, the PM_{2.5} concentration tends to be relatively low (Figure 402 S3 and Figure S4) and metal concentration values as well, which could explain the low OP 403 values. Finally, no significant correlation was found with the "crustal" source suggesting that 404 this latter does not significantly contribute to the OP values.

405

407 Unlike Spearman correlation which tests the correlation between pairs of variables, the 408 PCA is a multivariate analysis. It also allows to evidence discrete relationships between 409 variables that will be regrouped as components. PCA was applied to the composition data of 410 the 57 PM_{2.5} samples for the 29 studied species concentration. The source contributions and 411 OP values were considered as supplementary variables.

412 The 5 first obtained axes explain 71.7% of the data variability. As OP-AAv and OP-413 DTTv showed only significant correlation coefficients with the two first principal 414 components, the focus was only done on these latter (Figure 1 and Table S2). The variable 415 factor map of the two major axes which represent together 47.1% of the total variance is 416 presented in Figure 1c. Axis 1 is highly positively associated with metals (from high to low r 417 value with r > 0.6: Bi, K, Rb, Ag, Sn, As, Fe, Al, Ti, Pb, Mn, Ba, Co, TC and Ni) and 418 negatively associated with Na. So the first axis evidenced that several metals are correlated 419 and that when a concentration is high for one these elements, all the concentrations tends to 420 be also high for the others. From lower to higher values, axis 1 makes the distinction between 421 the typical sea components and the typical metals emitted by anthropogenic and industrial activities. NH4⁺, NO3⁻, SO4²⁻ and TC are negatively correlated with the second axis while Na, 422 423 Sr, Ca and Mg are positively correlated. Hence, the second axis makes the distinction between 424 the typical sea components (positive part of the axis) and the SIA (negative part of the axis). 425 In the region where the study takes place, SIA are mainly associated with winds blowing from 426 the East (continent) and long range transport while marine aerosol are mainly originates from 427 the North and western direction. When the marine contribution is high, the secondary aerosol 428 contribution tends to be low (Figure S3). This explains why SIA are placed against sea-salts components on the second axis. NH_4^+ , NO_3^- , SO_4^{2-} and TC contribute the most to the PM_{2.5} 429 430 mass, and a strong correlation (r = -0.70) was found between the PM_{2.5} concentration and the 431 second axis.

432 OP-DTTv was very strongly correlated (r = 0.84) with the first axis as a consequence 433 of the clear relationships between DTT test values and metal concentrations while OP-AAv 434 appeared only moderately anticorrelated (r = -0.48) with the second axis. Considering now 435 both dimensions but only 47.1% of the data variability, OP-AAv was related to the 436 "secondary nitrates", "secondary sulfates" and "combustion 2" (road traffic and biomass 437 combustion) sources. OP-AAv was also very strongly anticorrelated with "sea-salts" and 438 "aged sea-salts" sources. This result was not so well evidenced considering the whole data 439 variability by studying the correlation coefficient. Then for OP-DTTv, PCA findings were 440 mixed as it was only correlated with axis 1. Considering axes 1 and 2, only one clear 441 relationship appeared with the ISW sintering stack while several ones were evidenced from the correlation coefficient study. A deepest investigation will be done hereafter. 442

443

444 2.4. OP values and relationship with local and distant sources

445 Concentration roses and bivariate polar plots were used to study the link between OP 446 observed values and local sources contribution while CWT was used to search for regional 447 influences.

448

449

2.4.1. Mass-normalized and volume-normalized OP

Roses representing OP value versus wind direction and bivariate polar plots considering OP expressed in the two units (per m^3 or per $\mu g PM_{2.5}$) are given in Figure 2. OP-AA and OP-DTT did not exhibit exactly the same behavior regarding the wind direction. The maximum for mass-normalized OP-AAm and OP-DTTm was obtained when the wind blew from the northwest (NW) wind sector, while the maximum for volume-normalized OP was related to the southeast (SE) wind direction for OP-AAm, and SE, west (W) and northeast (NE) direction for OP-DTTm. The W-NW and the SE sectors correspond to the industrial park including the ISW and the urban sector, respectively, while in the northeastdirection is located the electric steel plant.

459 Especially when considering the OP-AA values, 1 µg of PM coming from the wind 460 sector including the industrial park showed the maximum intrinsic oxidative potential 461 compared to an equivalent mass of PM sampled from the others wind sectors. By normalizing 462 OP values to the air volume, this sector no longer exhibited the highest value. This is important information derived from this study. Considering 1 m³ of air that people breathe, 463 464 emissions from the industrial park do not appear as the most impacting on OP values. At our 465 study site, emissions from the SE sector corresponding locally to the urban sector or long 466 range transport influence (as it will be seen in section 2.4.3) appear to be the most 467 problematic, considering OP-AAv values. However, the OP-DTTv values showed not only a 468 maximum under the urban sector but also when the winds blew from the west direction 469 suggesting a high OP-DTTv potential for a source located in the industrial park.

470

471 2.4.2. OP relationships with the 11 identified CW-NMF sources

472 Figure 3 represents the volume-normalized source contributions bivariate polar plots 473 of the 11 identified PM_{2.5} emission sources in addition to the one for PM_{2.5} concentrations, for 474 comparison with the corresponding OP-DTTv and OP-AAv one. The use of bivariate polar 475 plots gives an additional strong criterion for validating the relationships between OP values 476 and PM source contribution evidenced with the Spearman correlation and PCA mathematical 477 tools. By using this, OP and source contribution values are distributed versus the wind 478 direction and wind speed. The geographical position of the sources as well the characteristics 479 of the emission (ie: resuspension or blowing back of chimney emission to ground level under 480 the effect of wind speed) are directly and indirectly considered when bivariate polar plots are 481 investigated (Carslaw et al., 2006; Ledoux et al., 2018). It makes possible to deepen 482 investigation and strengthen conclusions regarding relationships between OP values and483 source contributions.

484 Clearly OP-AAv showed a pattern similar to that of PM_{2.5} and road traffic and biomass 485 combustion ("combustion 2"). HULIS could be the reason of the relationship between OP and 486 combustion sources as they are highly redox active species known to participate to the OP 487 values and mainly emitted by combustion processes (Dou et al., 2015; Ma et al., 2018). This 488 observation is also consistent with the one of Yu et al. (2019), who found that vehicle 489 emissions (traffic exhaust and non-exhaust as a whole) highly contribute to ROS production. 490 Based on the polar plot patterns, traffic non-exhaust could also participate to OP-AAv but the 491 absence of correlation between both would suggest to reject the idea. These first observations 492 are in agreement with the PCA findings (Figure 1). However, PCA was suggesting a 493 relationship between OP-AAv and the secondary inorganic aerosols for 47.1% of the data. 494 The bivariate polar plots tend to discredit this as the corresponding plots are quite different 495 (Figure 2 and Figure 3). Except with the PM_{2.5}, combustion 2 and possibly traffic non-exhaust 496 source, OP-AAv pattern do not show any similarity with other sources, which could be 497 contradictory with partial conclusion done from the correlation coefficient study. This tends 498 to demonstrate that investigations using only the correlation coefficient between sources 499 contribution (or species concentrations) and OP are not enough to conclude about 500 relationships.

501 Unlike OP-AAv, OP-DTTv bivariate polar plot showed similarities and compatibilities 502 with several sources. Between them, the ISW sintering stack seems to be responsible for the 503 spot observed in the west direction at a wind speed close to $5 \text{ m} \cdot \text{s}^{-1}$. In the same direction, the 504 ISW fugitive and the heavy-fuel oil combustion source are also possible contributors. In 505 addition, in the east-northeast wind direction, the OP-DTTv concentration spot overlap the 506 one observed for the electric steel plant making emissions relate to this source another 507 OP-DDTv influencing factor. Relatively high values observed in the SE quarter could be the 508 fact of combustion 2 or traffic non-exhaust sources. In this case, observations matched quite 509 well those done from PCA study but also contradict again some conclusions done using the 510 correlation coefficient. For example strong correlation was found between secondary nitrates 511 and OP-DTTv (r = 0.67, p < 0.001), but their respective bivariate polar plots could challenge 512 it. Finally, our observation made possible to definitely dismiss the contribution of the sea-513 salts, aged sea-salts, crustal and secondary sulfates to the OP values.

514 Up to our knowledge, this is the first time that bivariate polar plots of OP and sources 515 contributions were compared to study and validate the influence of source emission on OP 516 values. In most of the published works, only correlation coefficients are used to conclude on 517 relationships between OP and species /sources. This could be inadequate in light of our results 518 which clearly demonstrate the interest to use bivariate polar plots as additional information.

519

520 2.4.3. Regional influence

521 The computing of OP-AAv and OP-DTTv with the air-mass back trajectories using the CWT 522 method allowed to study the impact of regional emissions on OP values (Figure 4). Regions 523 contributing the most to OP-DTTv are inland, including the upper part of the western 524 continental Europe notably France, Belgium, Germany and Poland. For OP-AAv, the main 525 hotspot is located in Belgium and the center of Germany. Long range transport from these 526 source regions located east to the study site could also explain the high OP values locally observed for eastern and southeastern wind on the bivariate polar plots. The North-Sea, the 527 528 English Channel and the coastal part of the Atlantic Ocean appears also as source region 529 especially for the OP-DTTv. This is in agreement with the relationships previously found 530 between OP-DTTv and heavy fuel oil combustion source and the CWT obtained for the latter 531 is also consistent with this. To be mentioned here that the English Channel and the North Sea are among the most used shipping routes for marine transportation (EEA, 2013b; Ledoux etal., 2018).

534 CWT results for secondary nitrates evidenced mainly Belgium and southern part of 535 Netherlands as source regions which is consistent with Pay et al. (2010) and Pay et al. (2012) 536 who identify these countries as important NO_x emitters. Secondary sulfates were originated 537 from Belgium, North of Germany and Poland who also showed exceedances of the SO₂ limit 538 value (EEA, 2012). In both cases, the similarity with the OP-AA_V and OP-DTTv CWT is 539 poor.

540 The highest concentrations of PM_{2.5} were traced back to North of France, Belgium, 541 Luxembourg, Netherlands and Germany also. This is consistent with the potential source 542 contribution results obtained by Waked et al. (2018) and Pay et al. (2012) who evidenced 543 these countries as important source of PM₁₀ in relation with industrial and shipping related 544 emissions especially for Belgium and Netherlands. Combustion 2 and traffic non-exhaust 545 CWT patterns showed higher concentrations on the continent which is totally in agreement 546 with the definition of the sources. Source regions of biomass and traffic related combustion 547 traffic-non-exhaust emissions match quite well the OP-DTTv and OP-AAv CWT confirming 548 the relationships suggested at a local scale. Eastern Europe, especially Bulgaria, Czech 549 Republic and Poland, was also identified as an important source of PM in Europe (EEA, 550 2013a). Nevertheless, we were unable to observe their influence as there were no air masses 551 coming from these regions during the sampling period.

552

553 Conclusion

 $PM_{2.5}$ collected in a coastal industrial city in Northern France was responsible for OP values in the same order of magnitude as those encountered in other world locations. $PM_{2.5}$ concentrations, some $PM_{2.5}$ components and $PM_{2.5}$ sources were found to be specifically 557 correlated with one of the two tests (AA and DTT). For one of the first time, bivariate polar 558 plots drawn for OP and source contributions were considered together to investigate their 559 relationships. Conclusions deduced from correlation coefficient studies and PCA were 560 challenged after using the OP and source contribution bivariate polar plots suggesting the 561 importance to use such a methodology. Ascorbic acid assay results appeared clearly linked to 562 the $PM_{2.5}$ concentrations and combustion sources. Dithiothreitol assay was clearly related to 563 sources emitting metals, in our case ISW diffuse and sintering stack, electric steel plant 564 emissions, heavy fuel oil combustion and possibly other combustion sources. Sea-salts, aged 565 sea-salts, crustal, secondary sulfates and secondary nitrates sources do not seem to contribute 566 to OP values. Some high OP values source regions have also been identified (Germany, 567 Belgium and Netherlands) showing that long range transport is also a parameter to consider 568 when studying OP of particulate matter.

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ISW-Fugitive



15

ISW-Sintering Stack





S

10 ws

0.12

0.1

0.08

0.06

0.04

0.02



0.012

0.01

0.008

0.006

0.004

0.002









Species	Mean	Median	Min	Max	SD	1st Qu	3rd Qu
Al	26.5	22.5	2.52	112.2	18.7	14.8	30.7
Ca	76.2	62.7	19.4	286	48.2	43.7	88.4
Fe	155	84.0	9.1	1542	231	37.1	195
Κ	122.7	91.1	29.2	358	83.0	62.0	156
Mg	61.9	39.3	4.35	305	64.1	16.6	72.1
Na	372	225	21.1	2225	419	105	404
Ag	0.07	0.04	0.00	0.42	0.08	0.01	0.09
As	1.09	0.78	0.00	9.45	1.38	0.31	1.45
Ba	0.88	0.74	0.19	5.01	0.67	0.56	1.08
Bi	0.15	0.11	0.00	0.62	0.14	0.04	0.26
Cd	0.46	0.23	0.01	7.98	1.08	0.08	0.44
Co	0.18	0.12	0.02	0.9	0.17	0.07	0.25
Cr	1.36	0.79	0.07	9.88	1.55	0.52	1.61
Cu	3.13	1.63	0.17	31.0	4.46	0.81	4.25
Mn	13.7	4.84	0.12	92.4	20.7	1.59	14.3
Ni	5.36	3.23	0.73	41.55	6.35	1.91	6.29
Pb	14.8	8.26	0.75	118	18.4	3.95	18.8
Rb	0.57	0.43	0.05	4.86	0.73	0.19	0.57
Sb	1.05	0.63	0.00	15.0	2.05	0.37	1.10
Sn	1.03	0.80	0.08	5.43	0.98	0.28	1.33
Sr	0.49	0.40	0.16	1.87	0.32	0.30	0.59
Ti	2.00	1.10	0.00	15.2	2.66	0.29	2.47
V	5.16	3.13	0.49	23.1	5.31	1.84	5.84
Zn	67.6	26.4	1.96	625	113	8.38	88.5
$\mathrm{NH_4^+}$	2010	1380	172	4817	1301	1043	3128
Cl	692	576	39.35	1752	409	418	841
NO ₃ -	8678	3619	331	49066	10683	1837	11545
SO_4^{2-}	2754	2008	127	9642	2022	1399	3453
TC	5151	3612	805	17547	4246	2008	6881
PM _{2.5} (µg/m ³)	29.2	18.8	3.1	90.8	24.4	11.30	44.30

Source	Markers (by order of abundance)	Contribution (ng·m ⁻³)		
		Average ± SD	(min - max)	
Sea-salts	Cl ⁻ , Na, Mg	699 ± 605	(0 - 3000)	
Aged Sea-salts	SO_4^{2-} , Na, NO_3^{-} , Mg, Cl ⁻	566 ± 595	(0 - 2166)	
Crustal	Ca, Al, Fe, Mg, K	56 ± 55	(0 - 257)	
Secondary Sulfates	SO ₄ ²⁻ , NH ₄ ⁺	2645 ± 2313	(0 - 10985)	
Secondary Nitrates	NO ₃ ⁻ , NH ₄ ⁺	10294 ± 13601	(0 - 60318)	
Heavy Fuel Oil Combustion	TC, V, Ni	145 ± 163	(0 - 620)	
Combustion 2	TC, NH4 ⁺ , NO ₃ ⁻ , K	5444 ± 4312	(0 - 19352)	
Traffic non-exhaust	Zn, Fe, Sb, Sn, Cr, Al, Pb, Mn, Cu	4.7 ± 4.3	(0 - 25)	
ISW-Fugitive	Fe, Ca, Zn, Al, Mn, Pb, As	150 ± 204	(0 - 1296)	
ISW-Sintering Stack	Cl ⁻ , K, NH4 ⁺ , Fe, Pb, Rb, Cd	209 ± 271	(0 - 1382)	
Electric Steel Plant	Zn, Fe, Pb, Mg, Pb, Cr, Ca, Mn, Cu	77 ± 142	(0 - 746)	

Site	Туре	Leaching agent	OP-DDTv	OP-DTTm	OP-AAv	OP-AAm	PM2.5	PM ₁₀	Reference
			$(nmol \cdot min^{-1} \cdot m^{-3})$	(pmol·min ⁻¹ ·µg ⁻¹)	(nmol∙min ⁻¹ •m ⁻³)	(pmol·min ⁻¹ · µg ⁻¹)	(µg∙m ⁻³)	(µg·m ⁻³)	
Dunkerque (FR)	urban industrial	G + Shk (24 h)	0.36	17.7	1.12	55	29.2		This study
Paris (FR)	urban	E + US (1 h)	0.23						(Jedynska et al., 2017)
Atlanta (USA)	urban	H₂O + US (30 min)	0.22	24					(Gao et al., 2020)
Hangzhou city (PRC)	urban	H₂O + US (30 min)	0.62	6.39			63.1		(Wang et al., 2019)
Beijing (PRC)	urban	H₂O + US (30 min)	12.6	130			113.8		(Yu et al., 2019)
Bologna (IT)	urban	PBS + US (15 min)	0.3-1.7		0.2-0.6				(Visentin et al., 2016)
Birmingham (USA)	urban	H₂O + US (30 min)			0.75				(Fang et al., 2016)
Grenoble (FR)	urban background	G + Shk (2 h)	1.00-4.12		0.17-2.46			7.4-22.3	(Calas et al., 2019)
Nice (FR)	urban background	G + Shk (2 h)	1.81-3.00		0.31-1.91			13.1- 21.4	(Calas et al., 2019)
Talence (FR)	urban background	G + Shk (2 h)	1.08-2.97		0.21-1.59			8.7-26.2	(Calas et al., 2019)
Passy (FR)	urban background	G + Shk (2 h)	1.91-10.0		0.30-7.20			8.6-59.2	(Calas et al., 2019)
Sarno (IT)	urban background	H ₂ O + US (30 min)	0.19	11.67			16.3		(Cesari et al., 2019)
Lecce (IT)	urban background	H ₂ O + US (30 min)	0.29	18.4			16.8		(Chirizzi et al., 2017)
Trento (IT)	urban background	PBS + US (15 min)	0.58	50	0.7	50		19	(Pietrogrande et al., 2018)
Site in Netherlands	urban background	PBS + No Filt	1.4				17.3		(Janssen et al., 2014)
Athens (GR)	urban background	H ₂ O + US (30 min)	0.33	27.98					(Paraskevopoulou et al., 2019)
Salento (IT)	suburban	PBS + US (15 min)	0.19-0.29	10-11	0.09-0.21	5-8	20-26		(Perrone et al., 2019)
Patalia (IN)	semi-urban	M+H ₂ O + US (30 min)	3.8	27			150		(Patel and Rastogi, 2018)
Atlanta (USA)	side street	H₂O + US (30 min)	0.78	50			15.6		(Vreeland et al., 2017)
Belgrade (BU)	tunnel traffic	H ₂ O + Shk (90 min)	0.37	9.43					(Jovanovic et al., 2019)
Atlanta (USA)	highway	H ₂ O + US (30 min)	1.08	70			18.3		(Vreeland et al., 2017)
Ala (IT)	industrial (Zn)	PBS + US (15 min)	0.61	120	1.4	60		20.3	(Pietrogrande et al., 2018)

	OP-DTTv	OP-AAv		OP-DTTv	OP-AAv
Species			Species		
Al	0.63*		V	0.47*	
Ca			Zn	0.74*	0.49*
Fe	0.77*	0.51*	$\mathrm{NH_{4}^{+}}$	0.50*	0.31
Κ	0.67*	0.55*	Cl		
Mg	-0.31	-0.54*	NO ₃ -	0.68*	0.39
Na	-0.53*	-0.62*	SO_4^{2-}	0.56*	0.28
Ag	0.73*	0.52*	TC	0.72*	0.68*
As	0.75*	0.61*			
Ba	0.79*	0.69*	Source contribution		
Bi	0.79*	0.39	Sea-salts	-0.40	-0.39
Cd	0.82*	0.47*	Aged Sea-salts	-0.55*	-0.67*
Со	0.66*		Crustal		
Cr	0.70*	0.56*	Secondary Sulfates	0.58*	0.38
Cu	0.85*	0.64*	Secondary Nitrates	0.67*	0.34
Mn	0.72*	0.33	HFO Combustion	0.45*	
Ni	0.63*	0.28	Combustion 2	0.37	0.54*
Pb	0.79*	0.63*	Traffic non-exhaust	0.80*	0.66*
Rb	0.75*	0.54*	ISW-Fugitive	0.67*	0.46*
Sb	0.70*	0.60*	ISW-Sintering Stack	0.60*	0.53*
Sn	0.82*	0.61*	Electric Steel Plant	0.64*	0.43*
Sr		-0.45*			
Ti	0.67*	0.32	Oxidative potential		
			OP-DTTv		0.46*
PM _{2.5}	0.67*	0.45*	OP-AAv	0.46*	



PM_{2.5} Oxidative Potential

No contribution of sea-salts, aged sea-salts, crustal sources, secondary sulfates and secondary nitrates to OP values