

Typical and Atypical Morphology of Non-volatile Particles from a Diesel and Natural Gas Marine Engine

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ABSTRACT

Non-volatile particle emissions from a marine engine fueled by either diesel or natural gas (NG) blended with diesel pilot gas were investigated via transmission electron microscopy (TEM). The most common particles (> 95% by number) were soot aggregates. These "typical" aggregates exhibited primary particle diameters of 20.7 ± 1.9 and 26.9 ± 1.7 for 100 nm aggregates when diesel and NG fuel were used, respectively. Highly non-uniform aggregates, with distinct groups of smaller and larger monomers, were visible in all of the samples but occurred most frequently with diesel fueling at high loads. The observed "atypical" particles, although rare (averaging 3% by number, as calculated by counting the number of particles for each type depicted in all of the collected images), were found in most of the samples and could have been produced by a variety of mechanisms. For instance, the spheres (approximately 300 nm in diameter) most likely arose from metals within the lubricating oil.

Keywords: Natural gas; Diesel; Transmission electron microscope; Primary particle diameter; Projected-area-equivalent diameter; Marine exhaust.

INTRODUCTION

Carbonaceous aerosols such as soot have an impact on the environment and human health (Janssen *et al.*, 2011). They are major contributors to radiative heating of the atmosphere (Jacobson, 2010). Important sources of soot include internal combustion engines, biomass burning, waste incineration, house and forest fires, furnaces, and flares (Rockne *et al.*, 2000; Bond *et al.*, 2004; Kazemimanesh *et al.*, 2019; Popovicheva *et al.*, 2019).

In internal combustion engines, different operating conditions, such as load, result in soot with different properties and with different impact on the environment (e.g., Gent *et al.*, 2019). Diesel engines are popular due to their reliability, power, and fuel economy, and the nature of its combustion emissions has been deeply investigated (Zhu *et al.*, 2005; Neer and Koylu, 2006; Patel *et al.*, 2012; Vyavhare *et al.*, 2019). However, diesel engine emissions are significant and are expected to increase with vehicle population. This motivates

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the use of alternative fuel types for emissions reduction.

Natural gas (NG) is emerging as an attractive alternative to diesel for marine engines due to its lower cost, lower soot, CO_2 and NO_x (Sommer *et al.*, 2019, Corbin *et al.*, 2019) emissions, and negligible sulfur content. There are relatively few studies of soot emissions from NG combustion in marine engines (Brynolf et al., 2014; Anderson et al., 2015; Lehtoranta et al., 2019; Corbin et al., 2020) and even fewer that address particle morphology (Moldanová et al., 2009; Popovicheva, 2009; Trivanovic, 2019). The environmental impact of soot contained in marine emissions includes radiative forcing (Bond et al., 2013), and detrimental effects on human health (Sofiev et al., 2018) and the marine ecosystem (Mari et al., 2014). An estimated 70% of shipping emissions occur within 400 km of coastlines, further increasing the particulate matter (PM) emissions in populated areas and contributing to local mortality (Corbett et al., 2007). Although the use of NG in shipping will reduce many emissions relative to diesel fueling, the increase in NG use for marine applications (Korakianitis et al., 2011; Corbin et al., 2019) is a concern, and it is important to understand the characteristics of the emissions. Furthermore, NG has potential for serious GHG emissions (CH₄), and these need to be effectively managed (Hesterberg et al., 2008).

Particle morphology affects the physical properties of the emissions and provides some clues to formation mechanisms (Olfert and Rogak, 2019). Both the aggregate size (characterized by projected-area-equivalent diameter, d_a) and primary particle diameter (d_p) are important. Fig. 1 shows an example of soot aggregate produced by a marine engine burning NG with a small amount of diesel fuel as pilot (at 11% load); here d_a and d_p are represented as a dashed blue and a continuous red circle, respectively.

Recent studies identify a clear correlation between the two parameters where an increase in d_p is linked with an increase in d_a (Dastanpour, 2016; Baldelli and Rogak, 2019; Olfert and Rogak, 2019). Eq. (1) characterizes this relationship between d_a and d_p , using two parameters. Here, $d_{p,100}$ is the primary particle size for an aggregate with a projected-area-equivalent diameter of 100 nm, and D_{TEM} is characteristic exponent.

$$d_{p} = d_{p.100} \left(\frac{d_{a}}{100 \text{ nm}}\right)^{D_{TEM}}$$
(1)



Fig. 1. Illustration of the projected-area-equivalent diameter (d_a) , larger and dashed blue line, and the primary particle diameter (d_p) , smaller and continuous red line. The image represents one soot aggregate generated by a NG-fueled engine at 50% load.

Several studies investigate this relation for soot produced by different fuels (China *et al.*, 2013; Dastanpour, 2016; Wang *et al.*, 2017; Yang *et al.*, 2019; Olfert and Rogak, 2019; Trivanovic *et al.*, 2019). Trivanovic *et al.* (2019) investigated the same dual-fueled NG-diesel engine studied in the present paper. Two power laws fit, one applicable to soot generated by diesel operation only (Eq. (2), and one for NG operation only (Eq. (3)):

$$d_p = (22 \pm 1.5) \left(\frac{d_a}{100 \text{ nm}}\right)^{0.41 \pm 0.06}$$
(2)

$$d_p = \left(28 \pm 1.0\right) \left(\frac{d_a}{100 \text{ nm}}\right)^{0.29 \pm 0.04}$$
(3)

Olfert and Rogak (2019) derived a "universal" fit that could be applied to soot produced by a variety of combustion systems using non-premixed flames:

$$d_p = (17.8) \left(\frac{d_a}{100 \text{ nm}}\right)^{0.35}$$
(4)

However, explicit reporting of these relations between d_p and d_a is very recent and most prior work reports d_p independently of aggregate size. Table 1 summarizes recent literature reporting TEM image analysis of soot from diesel or a dual-fueled NG-diesel engine. A small number of studies analyzed NG emissions (Anderson *et al.*, 2015; Trivanovic, 2019).

Trivanovic *et al.* (2019) analyzed soot produced by the same marine dual-fuel engine studied in this paper, but used a different particle sampler and did barely consider the effects of engine load on morphology or the presence of atypical particles—although their existence is briefly noted. *Atypical particles* refer to any sort of particle that differ from

Table 1. Primary particle diameter (d_p) and projected-area-equivalent diameter (d_a) derived from transmission electron microscope (TEM) images analysis and for engines using diesel or NG.

Study	Engine type	Load [%]	$\overline{d_a}$ [nm]	$\overline{d_{\rm p}}$ [nm]	$d_{ m p,100}$ [nm]	D_{TEM}
Lee et al., 2002	Diesel (heavy-duty, 4-cylinder)	0–50	$50 240 \pm 130$		NA	NA
Zhu et al., 2005	Diesel (light-duty, 1.7 L)	0-100	$119\pm34\texttt{*}$	26 ± 7	NA	NA
Neer and Koylu, 2006	Diesel (6-cylinder)	10-100	187 ± 163	27 ± 7	NA	NA
Mustafi and Raine, 2009	Diesel (single-cylinder)	20-80	123 ± 98	25 ± 6	NA	NA
	Dual diesel and NG	58-80 and 20-42	165 ± 49	28 ± 7		
Soewono and Rogak,	Diesel (light-duty, 1.9 L)	6–8	118 ± 53	29 ± 3	NA	NA
2011						
Ajtai <i>et al.</i> , 2016	Diesel (heavy-duty)	25–75	123 ± 84	NA	NA	NA
Nithyanandan et al., 2016	ithyanandan et al., 2016 Diesel (single-cylinder)		$350 \pm 90*$	21 ± 8	NA	NA
	Addition of NG	40 and 70	$390\pm100{*}$	24 ± 9	NA	NA
Lapuerta et al., 2017	Diesel (four-cylinder, 2.2 L,	19–45	NA	23 ± 6	NA	NA
	direct-injection)					
Trivanovic, 2019	Diesel	0–70	214 ± 38	29 ± 2	20.7 ± 2	0.42
	NG marine	0–90	191 ± 12	34 ± 1	26.9 ± 2	0.29

* Values are extracted from plots.

the typical appearance of soot aggregates. Some examples of atypical particles observed in previous studies are aggregates larger than a few micrometers, carbon nanotubes (CNTs) (Lagally *et al.*, 2012; Swanson *et al.*, 2016), mineral-like particles (Zhang *et al.*, 2018), and oil droplets (Rönkkö *et al.*, 2014; Anderson *et al.*, 2015; Xing *et al.*, 2019). A few studies focus on atypical particles generated by different exhaust, such as diesel combustion (Jung *et al.*, 2013; Rönkkö *et al.*, 2014; Zhang and Kook, 2015; Zhang *et al.*, 2018; Xing *et al.*, 2019), gasoline (Xing *et al.*, 2019), and NG (Anderson *et al.*, 2015). The lack of prior work on atypical particles from natural gas engine combustion and the low number of references analyzing atypical particles in any type of engine are a reason for the focus of the present paper.

MATERIALS AND METHODS

Engines and Sampling System

The engines and sampling methods are described by Trivanovic (2019). Briefly, one of two 4320 kWh, dual-fuel, four-stroke, nine-cylinder, compression-ignition engines on a commercial in-use vessel was used. The engine has a 150 mm bore and 180 mm stroke and operates at a nominal 1500 rev min⁻¹ with a maximum 80 kW output power. The fuel used was diesel (ultra-low sulfur diesel), while the NG was mostly composed by methane (90-92%) (Trivanovic et al., 2019). The engine operated with both NG and diesel fuel; the diesel pilot generates about 2% of the energy at high load and 10% of energy at low loads, with the remainder of the energy coming from the NG ignited by the diesel pilot combustion. For the idle condition, the diesel accounted for more of the fuel energy. Even though we are not certain of what the proportion is at idle, we assume that it is more diesel that NG since there is a minimum amount that the diesel injector can inject.

Emissions were sampled on board the vessel through a port in the engine exhaust system. The sampling and dilution system were in accordance with ISO 8178-1 and is described in full by Corbin *et al.* (2019). Of about 60 L min⁻¹ of diluted sample flow, 1 L min⁻¹ was sampled through a 2 m long sampling line to an electrostatic precipitator (ESPnano Model 100; DASH Connector Technology, Inc.), which sampled particles at 100 cm³ min⁻¹ onto an amorphous-carbon-coated copper TEM grid. Engine was operated with just diesel or diesel/NG and some duplicates were taken.

Morphology Characterization

A Hitachi H7600 transmission electron microscope (TEM) was used to image soot aggregates. This TEM unit, thanks to a 20 kV tungsten filament, was capable of 0.35 nm point-to-point resolution when utilizing a liquid nitrogen cold finger. The H7600 TEM was equipped with a side-mounted AMT XR50 CCD camera. Magnification values ranging from 8 to 100 k× were used to account for different sizes of aggregates.

Images for each sample were analyzed using the pair correlation method (PCM) (Dastanpour, 2016; more details in Supplementary Information [SI]). This code was also used by Trivanovic *et al.* (2019). Between 40 and 75 images

were analyzed for each sample. Each sample is defined as one grid; different grids are used for the same operating conditions in order to obtain a more statistically appropriate approach. Additionally, 8–15 images were taken in 5 different areas of the grid, as shown in the SI. The aggregates were randomly selected by scanning the 5 different areas manually.

Samples of particles were collected for a variety of engine loads and fueling conditions (diesel or NG with diesel pilot). Different load percentages are used for NG emissions (5, 11, 30, 50, 75, and 90%) and for diesel emissions (5, 25, 60, and 75%). The samples were categorized by the fuel used, NG or diesel, and the load percentage (*low* for load \leq 30%, *medium* for loads > 30% and \leq 60%, and *high* for loads \geq 75%). A total of 13 samples, among which 10 differ in at least one operating condition, were collected from NG operation emissions, and 8 samples were generated from diesel operation emissions. More information can be found in SI (Table S1).

RESULTS AND DISCUSSION

Typical Soot Aggregates

The typical structure of soot aggregates is well known (Tree and Svensson, 2007) to be small primary spherules combined in clusters with a fractal-like structure. Fig. 2 compares d_p and d_a , according to engine operating condition and fueling. The data points indicate the average of all the soot aggregates analyzed in each sample and the error bars indicate the 95% confidence interval around these means. The curve fit is obtained from a linear fit in log-log space to all of the individual aggregate measurements. Results from other research studies are also shown as a comparison. The power law fits are obtained using Eqs. (2) and (3), for diesel and NG emissions by Trivanovic et al. (2019), and Eq. (4) for a "universal" fit by Olfert and Rogak (2019). The consistency of results for diesel and NG in this engine could support the hypothesis (Corbin et al., 2019) that in NG mode the soot particles originate from the diesel pilot fuel, rather than from the NG. However, a larger dataset and additional experiments using other engines would confirm such hypothesis. Higher engine loads generate higher average d_a and d_p , which is clear in the averages plotted in Fig. 2 but not in the sample images of Fig. 3. Lapuerta et al. (2017) recognize a minor influence of the impact of the load to the distribution of d_p for diesel soot. The engine load is known not to directly affect the soot formation and oxidation. Instead, this is the result of changes in in-cylinder conditions (temperature, local and global air-fuel ratio, charge motion, and turbulence) (Virtanen et al., 2004). Collection time did not have a significant influence on d_p and d_a (Fig. S2).

Our curve fits in Fig. 2 are represented by the equations below for diesel and NG emissions ($R^2 = 0.99$), respectively:

$$d_p = \left(20.7 \pm 1.9\right) \left(\frac{d_a}{100 \text{ nm}}\right)^{0.42 \pm 0.05}$$
(5)

$$d_p = (26.7 \pm 1.7) \left(\frac{d_a}{100 \text{ nm}}\right)^{0.29 \pm 0.08}$$
(6)



Fig. 2. Relationship between the primary particle diameter and the equivalent-projected-area diameter for (a) NG and (b) diesel emissions. Data point represents the average of each sample listed in Table 1. The 95% confidence interval is shown by the error bars. The red dashed line represents the marine engine using diesel and NG (Trivanovic, 2019) and the dotted blue line represents the universal fit presented in Olfert and Rogak (2019).



Fig. 3. Images of typical soot aggregates generated by a marine engine operated on NG with diesel pilot fuel (top row) and on diesel fuel (bottom row).

These fitting parameters are not significantly different from those reported by Trivanovic *et al.* (2019) for an independent analysis of particles from this same engine, but are significantly different from the "universal fit" of Olfert and Rogak (2019), which included data from many lowpressure burners as well as compression-ignition engines.

In Fig. 3, typical soot is shown for the low, medium, and high engine load. The ring structures of soot aggregates identified by Baldelli *et al.* (2019), where monomers form a closed loop within the aggregate, cannot be positively identified without 3-D tomography, but it appears to be present in the images of Fig. 3 for NG (medium and high loads) and diesel (high load).

Atypical Soot

Soot with Non-uniform Primary Particles

Aggregates with some primary particle size variation within aggregates have been analyzed, Fig. 4. In some cases, these variations are extreme, but it is clear that primary particle diameters are uniform within large portions of the aggregate, as highlighted in Fig. 4. The red, blue, and green circles identify primary particle with large, medium, and small average primary particle diameter. Some previous references reported TEM images containing soot aggregates with a non-uniform distribution of primary particles; however, a size distribution was not reported (Neer and Koylu, 2006; Ushakov *et al.*, 2013; Kook *et al.*, 2016). For diesel at 75% load, 30 out of 75 images contained aggregates composed of primary particles with different diameters or containing aggregates with significantly different average primary particle diameters.

An interesting observation is that the group with the smallest primary particles appear at the outer edge of the aggregate in about 60% of the images containing soot with non-uniform primary particles. The loading density on the grids was sufficiently low that we are seeing the effect of coagulation rather than seeing multiple aggregates sampled on top of each other.

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Fig. 4. Images of non-uniform primary particles within aggregates in typical soot aggregates generated by a marine engine operated on NG with diesel pilot fuel (top row) and on diesel fuel (bottom row). For the NG case, the loads of low, medium, and high correspond to 10, 50, and 90% loads, respectively. For diesel, the corresponding values are 25, 50, and 75%. Red, blue, and green circles identify dispersion of small-, medium-, and large-sized primary particles. The number connected to these circles identifies the average primary particle diameter in nm.

Super-aggregates

Both fueling conditions occasionally produced super-micron aggregates ("super-aggregates"; Kim *et al.*, 2006; Chakrabarty *et al.*, 2012). Here, we classify as a super-aggregate any aggregate with d_a three times the average for the related fuel and load condition. Occasionally aggregates exceed 6 microns (Fig. 5), possibly the result of wall shedding (Timko *et al.*, 2009), but formation through coagulation is possible. In general, the super-aggregates have a lower aspect ratio than typical smaller aggregates. Restructuring after post-flame coagulation is a plausible mechanism for producing large



Fig. 5. Examples of "super-aggregate" particles produced by NG and diesel at different loads. These particles show a projected-area-equivalent diameter that is at least three times larger than the average projected-area-equivalent diameter for the related case.

compact structures; in this case the bonds between components of the aggregate would be weak relative to the large Brownian forces. Super-aggregates are visible in images for NG and diesel operation; however, a larger fraction of images contain super-aggregates for diesel operation (more details in Section 3.4).

Small Compact Aggregates

The largest aggregates appear unusually compact (with no or few internal voids in the TEM images of soot aggregates), but so do some smaller aggregates, shown in Fig. 6. Previous studies show particles with a similar appearance (Xi and Zhong, 2006; Liati and Eggenschwiler, 2010; Barone *et al.*, 2012; La Rocca *et al.*, 2013; Xing *et al.*, 2019) and the compaction is hypothesized to occur upon either the condensation or evaporation of volatile material (Zangmeister *et al.*, 2014). Here, such compacted aggregates were mostly observed for diesel operation at high loads; in the case of diesel at 75% of loads, 10 out of 75 images contained one or more compacted aggregates.

Most of the small compact aggregates have distinct primary particles. Such aggregates are frequently mentioned in the literature (Virtanen *et al.*, 2004; Bambha *et al.*, 2013; Xing *et al.*, 2019). Some speculate that these regular compacted aggregate are due to the high presence of oxygenated hydrocarbons (Lu *et al.*, 2008; Miljevic *et al.*, 2012) or sulfuric acid (Khalizov *et al.*, 2009; Henning *et al.*, 2012; Pei *et al.*, 2018). These compacted aggregates may have high hygroscopicity affecting cloud formation (Pei *et al.*, 2018).

A few small compact aggregates have no distinct primary particles and are denoted here as "fused," shown in Fig. 6 within red circles. These are found in only 7 images (out of a total of 753) and they are, thus, a very minor group. They appear similar to some examples shown in Xing *et al.* (2019) for a port-fueled gasoline engine; these authors suggest the source of particles is lubricating oil.

Non-soot Atypical Particles

The sections above discuss variations of soot aggregate morphologies. Below we consider less common types of



Fig. 6. Examples of the small compact aggregate particles. These particles are found in emission from natural gas (NG)-fueled engine at 5 and 10% load, and in diesel-fueled engine at idle and 60 and 75% load. Red circles identify "fused" cases where it is difficult to visualize the primary particles.

particles rarely discussed in the literature. Artifacts from the sample collection (ESPnano) cannot be completely ruled out, but there are no reports of such artifacts in the literature.

Spheres

Spheres are visible in the samples from NG operation at 5% load, and diesel operation at 25% load and idle. The highest number of cases observed are, however, for emissions of diesel engine at idle (estimated at 5%) where 6 cases are imaged, as shown in Fig. 7 highlighted with red circles. In case of emissions of NG at 5% and of diesel at 25%, about 5 and 2% of the images contained spheres, respectively. For diesel operation at idle (5%), about 5% of the images obtained contained one or more spheres. Independent of the fuel, these spheres have diameters from 190 to 350 nm. Furthermore, in most of the cases visualized (67%), these spheres are overlapping or located in the same spot as an aggregate. Some 33% of spheres are visualized far from any aggregate, as shown in Fig. 7.

Xing *et al.* (2019) and Rönkkö *et al.* (2014) identify similar particles, showing a spherical shape and containing mainly Ca, P and O. In both these cases, the formation rate of soot was extremely low because in the first study a portfueled gasoline engine was used, and in the second case the engine was motored (i.e., there was no combustion). It is well known that large amounts of unburned lubrication oil are emitted by diesel engines compared to NG-fueled engines, comprising 95% of the total volatile emissions (Sakurai *et al.*, 2003). Alternatively, this lubrication oil may undergo partial combustion. It is therefore most likely that the observed spheres originate from lubrication oil. These spheres are the most common type of non-soot particle found in emissions



Fig. 7. Images of the atypical particles named "sphere." These particles are found in emission from natural gas (NG)-fueled engine at 5% load, diesel-fueled engine at 25% load, and diesel-fueled engine at idle.

of heavy-duty diesel engines, and are higher at the idle running state (Rönkkö *et al.*, 2014).

Mineral-like Particles

A few samples contained small, very dark particles identified by strong electron scattering typical of metals or minerals. These "mineral-like" particles are shown in Fig. 8. In particular, the cases of 5, 10, 30, and 75% loads with NG show mineral-like particles for about 5% of the images collected. For 25 and 60% loads with diesel show 10% of the images containing some mineral-like particles. The case of diesel emissions at 25% load contains the highest count of this type of particles. Mineral-like particles were occasionally mixed with soot; in up to 90% of the images with mineral-like particles, they are spread over a large area of the grid. In addition, mineral-like particles are surrounded by a darker gray area indicating the presence of volatile organics (Bernard *et al.*, 2013). These areas are common in diesel- and gasoline-fueled engines (Müller *et al.*, 2006; Zhang *et al.*, 2017).

Mineral particles can be produced from fuel/oil additives or contamination, and they are so rare that we cannot conclusively determine their source here. However, we can make a couple of hypotheses. If these mineral-like particles are derived from the additives in the fuel engines, they are oxides and thus insoluble in water. However, if the cause of these minerals is the engine oil, a large quantity (possibly above a few mg) of this oil would be needed to generate large mineral-like crystals, 20-100 nm. Thus, oil as a source of mineral-like particles is not probable. Zhang et al. (2018) noticed particles with a similar appearance in exhaust from residential coal burning. They notice that mineral-like crystals of a large size can suggest an influence of water vapor from the environment during collection or after deposition (Li et al., 2011; Liu et al., 2017). Salt microparticles present in the environment can deposit on the collection system or substrate before or after collecting the engine emissions. In addition, the mineral-like particles appear polyhedral and spherical independently of the fuel type and load. Some



Fig. 8. Examples of atypical polyhedral mineral-like particles. These particles are found in emission from natural gas (NG)-fueled engine at 5, 10, 30, 50, and 75% load, and in dieselfueled engine at 25 and 75% load. Red circles identify examples of single mineral-like particles.

previous studies identify polyhedral and spherical particles deposited in samples collected from the environment and with high sodium (Na) content (Xing et al., 2019). Sodium containing particles can lead to different types of morphology according to their formation process that is mostly influenced by temperature, humidity, and solute/water ratio (Baldelli and Vehring, 2016a; Baldelli and Vehring, 2016b; Ferraz-Albani et al., 2017). In general, the longer the time these salts are in contact with water vapor and the larger the crystals size grows (Baldelli et al., 2016; Azhdarzadeh et al., 2016). Consequently, the mineral-like particles visualized in this project are estimated to be derived from the environment. However, most of the air directed to the engine is filtered, reducing the possibility of an infiltration of salt from the environment of the engine, most likely sea salt. Therefore, there could be rather an infiltration in the collection system or a presence of impurities on the collected substrate.

Fibers

Fibers were observed only in samples from NG operation. Higher loads show the highest percentages of fiber numbers (Fig. 9). Some fibers were surrounded by spheres with darker gray tones, which indicate the presence of volatile organics (expected since the majority of particle emissions from this engine were volatile organics; Corbin *et al.*, 2019). In other cases, these fiber particles are visible while embedded in a large soot aggregate or in a disordered and



Fig. 9. Images of the atypical particles named "fibers." These particles are found in emission from natural gas (NG)-fueled engine at 30, 50, and 75% engine load.

clustered area of the sample (Fig. 9). In addition, several fibers are embedded with small soot aggregates; in most of the cases, these fibers are separated by soot aggregates. Fiber particle are the least common for NG emissions (7 images out of 1025) and totally absent in diesel emissions. Based on previous work by Jung *et al.* (2013), Lagally *et al.* (2012) and Swanson *et al.* (2016), these fibers are most likely carbon nanotubes, presumably formed with aid of iron particles derived from wear or lubricant additives (Okada *et al.*, 2003). A similar study shows that Fe-bearing NPs, produced by vehicles, can be composed of magnetite, hematite, and goethite. Particles composed of goethite appear very similar to the example shown in Fig. 9 at NG 30% load (Gonet and Maher, 2019).

Frequency of Particle Types

Table 2 shows the frequency of each type of particles encountered in the samples taken for NG and diesel operation. A higher number of particles were imaged for NG emissions (1025) compared to diesel emissions (633). In any case, the typical soot aggregates represent the majority of the recorded particles. The frequency represents the percentage of a type of particle with respect to the total number of aggregates and particles manually counted in all the images recorded. The number of each type of particle is obtained by manually counting the number of particles of each type contained in all the images collected. The number of images collected per engine condition varies between 40 and 150 images.

Some particle types (e.g., super-aggregates, small compact aggregates) typically show only one of that type per image. However, for other types (e.g., fibers), an image will have multiple particles of that type, possibly introducing a positive bias in the observed frequency. On the other hand, such as for mineral-like particles and fibers, the identification of particles was challenging due to low contrast, low magnification, and/or the weak difference in grayscale between the particles and the background, which would result in underestimates of the frequency for these particle types.

As shown in Table 2, diesel emissions contain the highest number of atypical soot aggregates, while NG emissions produce the highest number of other types of particles, such

		NG (N = 1025 particles)			Diesel ($N = 633$ particles)		
Type of particles		Low	Medium	High	Low	Medium	High
		(N = 375)	(N = 455)	(N = 195)	(N = 103)	(N = 270)	(N = 260)
Typical soot		59.1	58.5	67.5	49.8	38.2	21.2
Atypical	Non-uniform primaries	14	13	16	21	46	51
soot	Super-aggregates	6.6	0.8	6.0	2.9	13	6.1
	Compacted	10	7.4	7.9	18	1.3	21
Atypical	Sphere	1.4	6.8	0	0	0	0
non-soot	Mineral-like	5.7	12	2.1	8.3	1.5	0.7
	Fibers	3.2	1.5	0.5	0	0	0

Table 2. Percentages of each type of particle by fuel type and load category. The number of aggregates counted is reported (N).

as sphere, mineral-like, and fibers. Non-uniform aggregates dominate in high loads of diesel, while mineral-like particles are elevated in medium loads of NG. Fiber particles are not present for diesel operation and spheres are contained only in cases of low loads of NG. These patterns are least partly explained by the much higher soot emission for diesel fueling, which will result in more coagulation between soot particles (Trivanovic *et al.*, 2019), as well as lower fractions of non-soot particles. We note that for the rarest atypical particles, zero observations do not necessarily indicate zero abundance of those particles.

CONCLUSION

Typical and atypical soot aggregates and atypical nonsoot aggregates produced by an engine dual-fueled by NG and diesel were examined via TEM. The relation between d_a and d_p exhibited by the typical soot particles provided fitting parameters that reproduced the values from independent work on the same engine model within 95% confidence intervals. Comparing our results with those in a previous study, differences in collection procedure and microscope operation generated an average difference of 7% in the primary particle size. Higher engine loads slightly tended to produce larger aggregates and larger primary particle sizes, and the averages for each load closely followed the correlations fitting the individual aggregate data.

The atypical soot particles were identified and counted, and their potential sources were suggested. Non-uniform soot aggregates, which displayed clearly different average primary particle sizes for different regions of an aggregate, were also identified and were attributed to the coagulation of pre-existing aggregates following combustion; these aggregates were more common in the diesel samples. Additionally, super-aggregates and compact aggregates were observed and attributed to wall shedding or coagulation, and the evaporation of volatile organics or possibly water during emission or sampling, respectively. All of these soot aggregates were considered to have originated from the diesel fuel (as either the main fuel or the pilot fuel).

Atypical non-soot particles were detected during both NG and diesel operation, and their sources were investigated by referring to the literature. In the cases of low or medium loads with NG, fibers possessing the same morphology and appearance as carbon nanotubes (CNTs) reported in previous engine emission studies were observed. Minerallike particles, either from contaminants or fuel/oil additives, were very rare, but some of the observed spheres may have been generated by ash formed from elements (Ca and P) in the lubricating oil.

Overall, the atypical particles comprised a small fraction of the total particles; thus, they would not have significantly influenced the extensive properties of the observed aerosol. Our quantification of these particles therefore increases our confidence in our earlier conclusions that the emissions of this NG engine are dominated by soot and volatile organic compounds. However, future atmospheric studies may find the presence of these atypical particles to be useful in tracing marine engines or NG combustion sources. Furthermore, the influence of such particles is not yet fully understood and may warrant a more dedicated investigation.

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SUPPLEMENTARY MATERIAL

Supplementary data associated with this article can be found in the online version at http://www.aaqr.org.

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