# **Model studies of volatile diesel exhaust particle formation:**

- 2 Organic vapours involved in nucleation and growth?
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## 1 Abstract

2 A high concentration of volatile nucleation mode particles (NUP) formed in the atmosphere 3 when the exhaust cools and dilutes has hazardous health effects and it impairs the visibility in 4 urban areas. Nucleation mechanisms in diesel exhaust are only poorly understood. We performed model studies using two sectional aerosol dynamics process models AEROFOR 5 6 and MAFOR on the formation of particles in the exhaust of a diesel engine, equipped with an 7 oxidative after-treatment system and running with low fuel sulphur content (FSC) fuel, under 8 laboratory sampling conditions where the dilution system mimics real-world conditions. 9 Different nucleation mechanisms were tested. Based on the measured gaseous sulphuric acid 10 (GSA) and non-volatile core and soot particle number concentrations of the raw exhaust, the 11 model simulations showed that the best agreement between model predictions and 12 measurements in terms of particle number size distribution was obtained by barrierless heteromolecular homogeneous nucleation between the GSA and a semi-volatile organic 13 14 vapour combined with the homogeneous nucleation of GSA alone. Major growth of the particles was predicted to occur by the similar organic vapour at concentrations of  $(1-2)x10^{12}$ 15 cm<sup>-3</sup>. The pre-existing core and soot mode concentrations had an opposite trend on the NUP 16 formation, and the maximum NUP formation was predicted if a diesel particle filter (DPF) 17 18 was used. On the other hand, the model predicted that the NUP formation ceased if the GSA concentration in the raw exhaust was less than 10<sup>10</sup> cm<sup>-3</sup>, which was the case when biofuel 19 20 was used.

#### 2 1 Introduction

3 Regardless of many improvements in vehicle technology exhaust particles emitted from 4 traffic constitute major air pollutants in urban environments (e.g. Pey et al., 2009). Although 5 the mass emissions of diesel particles have been reduced due to the tightened emission regulations, the number emission of exhaust nanoparticles has been reported to be significant 6 7 (Rönkkö et al., 2013, Lähde et al., 2010). These non-regulated particles can penetrate deepest 8 into the human pulmonary and blood-vascular systems having hazardous health effects (Pope 9 and Dockery, 2006, Sioutas et al., 2005, Kettunen et al., 2007, .Su et al., 2008, Alföldy et al., 10 2009). Exhaust particles also affect the climate by scattering or absorbing solar radiation and participating in cloud formation (Charsson, et al., 1992, Bond et al., 2013). 11

12 The major source of diesel particulate mass is soot particles in the size range of 50 - 1000 nm 13 by mass but in the size range of 40 - 100 nm by number (mobility diameter) (Kittelson, 1998). 14 These particles are formed in the combustion process and are composed of non-volatile 15 carbonaceous soot agglomerates, onto which semi-volatile vapours can condense (e.g. 16 Kittelson, 1998, Tobias et al., 2001). The Euro 6 level diesel vehicles are equipped with diesel 17 particle filters (DPF) or partial diesel particle filters (pDPF) (Heikkilä et al., 2009) which 18 remove totally or partly soot particles. The oxidative after-treatment systems such as diesel 19 oxidising catalyst (DOC) reduce exhaust hydrocarbon concentrations but simultaneously 20 increase SO<sub>2</sub> to SO<sub>3</sub> conversion enhancing gaseous sulphuric acid (GSA) formation (Arnold 21 et al., 2006, 2012, Maricq et al., 2002). The GSA has a very low saturation vapour pressure, 22 and it has been shown to participate in condensation and nucleation processes during the 23 dilution and cooling of the exhaust (Arnold et al., 2006, 2012, Rönkkö et al., 2013, Shi and 24 Harrison, 1999, Tobias et al., 2001, Schneider et al., 2005, Khalek et al., 2003). These 25 nucleation mode particles (called hereafter volatile nucleation mode) consist of volatile 26 material such as water, sulphate and hydrocarbons (Kittelson, 1998) which evaporates when 27 heated at 265 °C. With some vehicle technologies and in some driving conditions, 28 nanoparticles possessing a non-volatile core of around 10 nm or less in size have been 29 observed (hereafter called core mode). These particles are suggested to be formed by fuel 30 aliphatic hydrocarbons (Filippo et al., 2008) or lubricant oil metal compounds (Kittelson et al, 2008, Rönkkö et al., 2013, Karjalainen et al., 2014) coated by condensing volatile
 hydrocarbon and sulphur compounds (Rönkkö et al., 2007, Rönkkö et al., 2013).

3 Although the measurements indicate that sulphuric acid participates in the production of 4 volatile exhaust particles, the nucleation mechanism is not known. Numerous different 5 nucleation theories involving sulphuric acid such as homogeneous binary nucleation (BHN) (Kulmala et al., 1998, Vehkamäki et al., 2002, 2003), ternary nucleation (Napari el al., 2002, 6 7 Merikanto et al., 2007), activation nucleation (Kulmala et al., 2006), kinetic nucleation 8 (Weber et al., 1997), ion-induced nucleation (Raes et al., 1985, Arnold et al., 1999, Yu and 9 Turco, 2000), and recently sulphuric acid-amine nucleation (Almeida et al., 2013) as well as sulphuric acid along with oxidized organic vapours (e.g. Riccobono et al., 2014) have been 10 11 proposed to explain nucleation bursts under atmospheric conditions. Since vehicle exhaust 12 includes similar species as in the atmosphere, the NUP formation might occur in the same 13 way. Arnold et al. (1999) have actually made mass spectrometric measurements of chemi-ions present in the exhaust of combustion engines, including car engines and aircraft gas turbine 14 15 engines. On the other hand, Ma et al. (2008) reported that ion-induced nucleation did not play an important role in the NUP formation of diesel exhaust. Ion-induced nucleation is not 16 17 considered in this study.

Recently published models simulating the formation and growth of exhaust particles can be divided into two groups. Some of them are process models (Shi and Harrison, 1999, Voutsis et al., 2005, Lemmetty et al., 2008, Hu and Yu, 2006, 2008) as is also the model considered in this study, whereas some are computational fluid dynamics (CFD) models coupled with aerosol dynamics (Uhrner et al., 2007, Albriet et al., 2010, Liu et al., 2011) and with the major turbulent mixing processes as well (Wang and Zhang, 2012).

24 Shi and Harrison (1999) concluded that the BHN predicted several orders of magnitude lower 25 nucleation rates than those measured even though the fuel sulphur content (FSC) was as high as 300-500 ppm, and no sink processes such as condensation and coagulation were taken into 26 27 account. The simulation results reported by Vouitsis et al. (2005) showed that the barrierless 28 nucleation scheme, where clusters are always stable against evaporation (Clement and Ford, 29 1999), could predict the NUP concentration rather well for low sulphur fuel (FSC=10 ppm), 30 whereas the nucleation rate proportional to the square of sulphuric acid saturation vapour 31 pressure was more appropriate for high sulphur fuel (FSC=250 ppm).. Lemmetty et al. (2008)

discovered that by assuming the high SO<sub>2</sub> to SO<sub>3</sub> conversion ratio of 90% BHN nucleation 1 2 reproduced the measured size distributions opposed to barrierless nucleation. Du and Yu (2006) concluded that by using their kinetic BHN model for the vehicles running on the fuel 3 with the FSC of 330 ppm, the BHN scheme could not predict the measured NUP 4 5 concentrations if the SO<sub>2</sub> to SO<sub>3</sub> conversion ratio was 1%, but that it was appropriate for the ratios greater than 4% even though FCS was less than 50 ppm. If the FSC was 15 ppm, the 6 7 BHN was the main source of NUP only for vehicles equipped with continuously regenerating 8 particle filters (Du and Yu, 2008).

9 All of these studies indicate that other low or semi-volatile condensable vapours than GSA are 10 required to explain the measured particle number size distributions. However, all of the 11 previous model studies suffer from the lack of GSA measurements. It is well-known that even 12 a small change in the GSA concentration can cause several orders of magnitude difference in 13 the binary nucleation rate.

Based on the model simulations, the main objective of this study is to quantify the relevant 14 nucleation mechanism and the concentrations of semi-volatile (COVs) and/or low-volatile 15 16 (COV<sub>1</sub>) condensable organic vapours needed to explain the diesel particle evolution in an 17 ageing chamber under laboratory conditions which mimic well the atmospheric dilution 18 conditions. For the first time the applicability of nucleation between an organic compound 19 and sulphuric acid in diesel exhaust was investigated. The other objective is to investigate 20 how changes in vehicle after-treatment technologies, fuel and lubricant oil affect exhaust 21 particle nucleation and growth.

22 The model simulations were performed by an aerosol dynamics model AEROFOR (e.g. 23 Pirjola, 1999, Pirjola and Kulmala, 2001, Lemmetty et al., 2008, Arnold et al., 2012). The 24 GSA and particle concentrations in the raw exhaust were adopted from the measurements by 25 Arnold et al. (2012) and Rönkkö et al (2013). The first model simulations by AEROFOR for 26 the same engine equipped with the DOC and DPF have already been described in Arnold et 27 al. (2012). Since AEROFOR produces only the time evolution of the particle number size 28 distributions and concentrations, some of the simulations were repeated with another aerosol 29 dynamics model MAFOR (Karl et al., 2011) which is able to produce the mass and 30 composition size distributions of a multicomponent aerosol.

Both models, AEROFOR and MAFOR, are Lagrangian type box models which are well established and evaluated. Although these models are not able to give a spatial distribution of temperature and aerosol scalars in the sampling system (Olin et al., 2015), they were able to achieve the goals of this study, and subsequently increase our understanding on the formation and transformation mechanisms in diesel exhaust under laboratory and atmospheric conditions.

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## 8 2 Methods

9 2.1 Sampling system and measurements

10 Since the detailed description of the measurements and instrumentation can be found in 11 Arnold et al. (2012) and Rönkkö et al. (2013), only a short description relevant to modelling 12 is given here. The emission measurements of a Euro IV standard heavy duty diesel engine 13 were performed on an engine dynamometer. Four steady-state conditions with engine loads of 14 100%, 75%, 50% and 25% were studied. The FSC was 36 ppm, additionally the FSC of 6 15 ppm and biofuel (FSC < 1 ppm) were used in some experiments. Different after-treatment 16 systems were used, however, this research mainly deals with the cases when the engine was 17 equipped with DOC and pDPF.

18 The particle sampling and dilution system was a modified version of partial flow sampling system (Ntzhiachristos et al. 2004). The system consisted of a porous tube type primary 19 20 diluter followed by an ageing chamber and an ejector type diluter (Fig. 1). Although it is clear 21 that the system simplifies the real-world vehicle exhaust dilution process and thus does not 22 completely reproduce all the details of the real-world process, it has been shown to reproduce 23 the real-world exhaust nucleation particle formation and growth relatively well (Gieschaskiel 24 et al., 2005; Rönkkö et al., 2006; Keskinen and Rönkkö, 2010). Therefore, the system has 25 been used especially in laboratory studies focusing on vehicle exhaust nanoparticles (e.g. 26 Vaaraslahti et al., 2005; Rönkkö et al., 2006; Arnold et al., 2012; Rönkkö et al., 2013).

The ageing chamber was used to ensure adequate residence time for the condensational growth of the nucleation mode particles in the cooled and diluted aerosol sample. The following ejector diluter was used to bring the sample into the ambient pressures and to

ensure that the particle number concentration was in the measurement range of particle 1 2 measurement equipment, without significant effects on particles formed during exhaust dilution and cooling (Giechaskiel et al. 2009). In the primary diluter, the dilution air 3 temperature was 30 °C, the relative humidity was close to zero and the dilution ratio was 4 5 adjusted to 12. The dilution ratios were calculated from the measured CO<sub>2</sub> concentrations of the diluted exhaust sample and the raw exhaust. Based on the constant exhaust flow rate in the 6 7 dilution and sampling system (55 lpm) and the measurements mentioned in Fig. 1, the 8 residence time of the exhaust in the tube between the PD and AC was 0.1 s and in the ageing 9 chamber 2.6 s. Furthermore, exhaust temperature was measured at two points marked in 10 Fig.1.

Particle number size distributions of the exhaust were measured using two scaning mobility particle sizers (SMPS) measuring the particle diameters 3-60 nm and 10-430 nm. Also the size distributions for all engine loads were measured using a thermodenuder TD in which the volatile material was evaporated at 265 °C temperature. The size distributions were corrected for particle losses in both SMPS and thermodenuder (Heikkilä al., 2009).

The gaseous sulphuric acid GSA was monitored by a CIMS (Chemical Ion Mass Spectrometer) whose setup consists of a flow tube reactor through which the exhaust plume is passed. Details of the instrument can be found in Fiedler et al. (2005) and Arnold et al (2012). In addition, the acidic trace gases were measured in a way analogous to GSA. The uncertainty of the measured GSA present in the flow tube reactor was  $\pm 30\%$ , whereas only a lower limit concentration was obtained for all other acidic gases, several of which could be identified as dicarboxylic acids, including malonic, succinic, glutaric and adipic acids (Arnold et al., 2012).

### 23 2.2 Model descriptions

24 The model simulations were performed by a slightly updated version of an atmospheric 25 chemistry and aerosol dynamics box model AEROFOR (e.g. Pirjola, 1999, Pirjola and 26 Kulmala, 2001, Pirjola et al., 2004, Arnold et al., 2012). The model includes gas phase 27 chemistry, formation of thermodynamically stable clusters by different nucleation 28 mechanisms, condensation of H<sub>2</sub>SO<sub>4</sub>, H<sub>2</sub>O and an organic vapour onto particles (Fuchs and 29 Sutugin, 1970) taking into account molecular dimensions (Lehtinen and Kulmala, 2003), Brownian coagulation of particles (Fuchs, 1964), temperature and cooling profiles (Lemmetty 30 et al., 2006), wall losses (Voutsis et al., 2005) as well as mixing with the particle-free dry 31

diluted air. The Kelvin effect was taken into account in the condensation processes of organic
vapour and sulphuric acid. The saturation vapour pressure of sulphuric acid was calculated
according to eq. (8) in Vehkamäki et al., 2003, and surface tension as explained in Vehkamäki
et al., (2003), valid at least up to 360-400 K.

5 In this study, four nucleation mechanisms were used: 1) classical binary homogeneous H<sub>2</sub>SO<sub>4</sub>-H<sub>2</sub>O nucleation (BHN) (Vehkamäki et al., 2003), 2) activation theory (ACT) 6 7 (Kulmala et al., 2006) where under the steady state nucleation rate the number of activated 8 clusters is linearly proportional to the sulphuric acid concentration, i.e. the nucleation rate J = 9 A[H<sub>2</sub>SO<sub>4</sub>] (A=activation coefficient), 3) kinetic nucleation (KIN) (McMurry and Friedlander, 1979, Weber et al., 1997, Sihto et al., 2006), where homogeneous homomolecular nucleation 10 occurs involving two sulphuric acid molecules and thus the nucleation rate J is proportional to 11 the square of the sulphuric acid, i.e.  $J = K[H_2SO_4]^2$  (K= kinetic coefficient which includes the 12 collision frequence and the probability of formation of a stable particle after the collision), 4) 13 14 homogeneous homomolecular nucleation of sulphuric acid along with homogeneous 15 heteromolecular nucleation betweeen sulphuric acid and organic vapour molecules (HET) (Paasonen et al., 2010), ie.  $J = K_1[H_2SO_4]^2 + K_2[H_2SO_4][org]$ . The diameter of the nucleated 16 particle was assumed to be 1.5 nm (Kulmala et al., 2007). 17

18 The condensable organic vapours that contribute to particle evolution in diesel exhaust are not 19 yet identified. However, based on the measurements, Arnold et al. (2012), Kawamura and 20 Kaplan (1987) and Zervas et al (2001) have observed condensable dicarboxylic acids in the exhaust of vehicles. On the other hand, the TDMA volatility measurements by Sakurai et al. 21 22 (2003) indicate that the organic component of diesel nanoparticles was comprised of compounds with carbon numbers in the  $C_{24}$ - $C_{32}$  range, which were derived almost entirely 23 24 from unburned oil. Although there may be thousands of different low and semi-volatile 25 condensable organic vapours we have used in AEROFOR a semi-volatile organic compound called COV<sub>s</sub> with the properties of adipic acid to represent all condensable organic vapours. 26 27 Moreover, a low-volatile organic compound with volatility corresponding to that of n-alkane  $C_{34}H_{70}$  (constituent of the engine oil) called COV<sub>1</sub> was used in MAFOR. 28

In addition to condensation,  $COV_s$  was assumed to participate in heteromolecular nucleation. The thermodynamical properties for  $COV_s$  were adopted from literature, i.e. temperaturedependent expressions for the saturation vapour pressure from Bilde et al. (2003) and for the

surface tension by Riipinen et al. (2007) (Table 2). The molecular weight of 0.146 kg mol<sup>-1</sup> 1 and the liquid phase density of 1085 kg  $m^{-3}$  were used. The vapour concentration is a free 2 parameter. Pure adipic acid is insoluble in water. Hämeri et al. (2002) have measured that the 3 4 organic fraction of the mixtures containing adipic acid and ammonium sulphate does not contribute to water uptake. However, Yeung et al. (2009) found out that adipic acid can have 5 effects similar to those of more water-soluble organic species. AEROFOR assumes that COVs 6 7 uptakes water as sulphuric acid, and therefore the water content and wet diameters of the 8 particles might be overestimated

9 To minimise the effect of numerical diffusion typical for sectional models, 100 size sections 10 turned out to be sufficient. The fixed sectional presentation for aerosol size distribution was 11 used since the sectional representation is more advantageous for the treatment of simultaneous 12 nucleation and particle transformation than the modal aerosol representation. Especially in 13 diesel exhaust, the rapid formation of volatile particles may lead to size distribution peaks that 14 do not have a lognormal shape.

The set of stiff differential equations describing the time evolution of particle number concentrations in each section as well as the vapour concentrations was solved using Numerical Algorithms Group, Ltd. library FORTRAN-routine D02EJF (1990). The time step was set to 0.01 second.

19 Some of the cases simulated by AEROFOR were repeated by a Multicomponent Aerosol Dynamic model MAFOR (Karl et al., 2011). The model describes aerosol formation by 20 21 different nucleation processes (details on nucleation options in Karl et al., 2012a), here only 22 the HET nucleation option was used. Further aerosol processes are condensation of H<sub>2</sub>SO<sub>4</sub>, 23 H<sub>2</sub>O, COV<sub>s</sub> and an extremely low-volatile non-hygroscopic vapor COV<sub>1</sub> (Table 2), as well as Brownian coagulation, and mixing with the particle-free dry diluted air. COV<sub>s</sub> has the 24 25 properties of adipic acid (same as in AEROFOR) but different water uptake since the hygroscopic properties of COV<sub>s</sub> in MAFOR were that of sodium succinate (Peng and Chan, 26 27 2001), i.e. COV<sub>s</sub> starts to take up water at RH>48%, and has a growth factor of 1.85 from 28 10% to 90% RH. The saturation vapour pressure for COV<sub>1</sub> was adopted from Lemmon and 29 Goodwill (2000). Due to its extremely low vapour pressure, the Kelvin effect was not included in the COV<sub>1</sub> condensation. Thus COV<sub>1</sub> assists in the initial growth of nucleated 30 31 particles of 1-2 nm diameter in size for which the Kelvin barrier is huge. The Kelvin effect drops sharply as the particle size increases due to its exponential dependence on diameter, enabling condensation of more volatile compounds, such as  $COV_s$ . Since n-alkanes do not form hydrogen bonds with sulfuric acid, it is further assumed that  $COV_1$  is not a nucleating compound.

5 The mass transfer of gas molecules to particles is calculated using the Analytical Predictor of Condensation scheme (Jacobson, 1997). The composition of particles in any size bin can 6 7 change with time due to multicomponent condensation and/or due to coagulation of particles. Thus, the size-segregated chemical composition of the generated particulate matter can be 8 9 tracked at high temporal resolution. MAFOR has been evaluated with chamber data (Karl et al., 2012b), particle number measurements at a motorway (Keuken et al., 2012), and it has 10 been shown to compare well with AEROFOR (see Karl et al., 2011). In this study, 120 size 11 12 bins were used to represent the aerosol size distribution ranging from 1.5 nm to 10  $\mu$ m diameter. An effective density of 1200 kg m<sup>-3</sup> (Virtanen et al., 2002) was used for soot 13 particles. The tests with 1000 and 1500 kg m<sup>-3</sup> showed that the results were not sensitive to 14 15 the applied density value.

### 16 **2.3** Input values based on the measurements

In the model simulations with AEROFOR and MAFOR the raw exhaust dilutes rapidly by dry air (T = 303 K) so that the final dilution ratio DR<sub>f</sub> is 12. Since it is very difficult to mathematically analyse the dilution and cooling processes they are described in simple parameters as in Lemmetty et al. (2006). A detailed simulation of cluster and particle formation during cooling in a porous diluter is out of the scope of this study (see e.g. Pyykönen et al., 2007, Olin et al., 2015). According to Lemmetty et al. (2006), the temperature was assumed to follow the exponential curve of the Newtonian cooling

24 
$$T(t) = T_{fin} + (T_1 - T_{fin}) \exp\left(-\frac{t}{\tau_c}\right)$$
(1)

where  $T_1$  is the raw exhaust temperature and  $T_{fin}$  the final exhaust temperature. The parameter  $\tau_c$  is the time constant for cooling, and it refers to the time when the remaining excess temperature is ~ 37% (=1/e %) of the original value. In this study,  $\tau_c$  was determined based on the temperature measurements at two points shown in Fig. 1, and a value of 0.03 s was obtained at all engine loads. Similarly to Lemmetty et al. (2006), dilution is modelled by
 using an exponential equation

3

$$DR(t) = DR_{f}^{1/\tau_{d}}, t < \tau_{d}$$
<sup>(2)</sup>

The dilution time constant  $\tau_d$  is the time in which the system has achieved the final dilution ratio, and no dilution occurs after this. In this study  $\tau_d$  is a free parameter. Its value was assumed to be 0.12 s; however, sensitivity tests will be presented in section 3.3.1. It should be noted that by assuming that cooling is caused only by dilution, the upper limit for  $\tau_c$  is determined by an equation (Lemmetty et al., 2006)

9 
$$\tau_{\rm c} \le \frac{\tau_{\rm d}}{\ln({\rm DR_f})}.$$
 (3)

## 10 Consequently, $\tau_d$ must be $\ge 0.075$ s.

The initial exhaust particle size distribution (raw exhaust) accounted for two modes, the soot mode and the core mode, both formed in the combustion processes in the engine. The modal geometric mean diameters ( $D_g$ ), number concentrations and standard deviations (Table 1) were adopted from the measurements (Rönkkö et al., 2013).

The initial raw exhaust GSA concentrations were as well adopted from the measurements (Arnold et al., 2012, Rönkkö et al., 2013). During the 100% engine load periods the GSA concentration varied from  $2.2 \times 10^9$  to  $3 \times 10^{12}$  cm<sup>-3</sup>, during the 75% engine load period from  $1.2 \times 10^{11}$  to  $3 \times 10^{11}$  cm<sup>-3</sup>, and during the 50% period it was around  $6 \times 10^{10}$  -  $1 \times 10^{11}$  cm<sup>-3</sup> (Figure 2). The history of the after-treatment system (ATS) had a large effect on the concentrations, especially, during the first 100% engine load the increasing trend in the GSA concentration indicates strong storage effect of sulphuric acid onto the walls of the ATS.

Model simulations were performed mainly at the 100% engine load phases even though some simulations were repeated at 75% and 50% engine loads. The models were initiated by the measured GSA and non-volatile particle concentrations given in Table 1.

## 1 **3** Results and discussion

#### 2 **3.1** Comparison of the nucleation mechanisms

## 3 **3.1.1 Binary homogeneous nucleation**

In the first set of model simulations the BHN mechanism was assumed. Fig. 3a illustrates the evolution of the particle number concentration  $N_3$ , gas concentrations and nucleation rate, along with the particle number size distribution at the end of the simulation when the initial GSA concentration was  $2x10^{12}$  cm<sup>-3</sup>, which was the measured stabilized concentration at the end of the second 100% engine load in Fig. 2. Also shown is the measured particle size distribution at the end of the ageing chamber (Fig. 3b black curve), and time development of the condensation sink CS (Fig. 3c).

11 Two features emerge from the figures. First, nucleation occurs very fast, and it starts after 0.1 s just at the entrance of the ageing chamber, and reaches the momentary maximum value 12  $3.0 \times 10^9$  cm<sup>-3</sup> s<sup>-1</sup> after 0.23 s. Nucleation is totally suppressed after one second if no 13 14 condensable organic vapour is present, and somewhat faster, after 0.6 s, if the condensable organic vapour concentration is present with a concentration of  $8 \times 10^{12}$  cm<sup>-3</sup>. Sulphuric acid 15 16 concentration decreases first mainly by dilution, but after 0.12 s nucleation and condensation 17 are competing processes. The time evolution of the condensation sink (CS) (e.g. Pirjola et al., 1999, Kulmala et al., 2001), whose inverse is a measure of the lifetime of condensable vapour 18 molecules in the exhaust, is presented in Fig. 3c for the simulations with and without organic 19 20 vapour. The initial CS is 3.5 s<sup>-1</sup> based on the dry core and soot modes. Due to dilution it decreases during the first 0.17 s but then steeply increases up to a value of 8 s<sup>-1</sup> as long as 21 22 nucleation occurs, and after the suppression of nucleation slightly decreases as the number concentration decreases due to coagulation, even though condensation still grows the 23 particles. For comparison, typical atmospheric CS values are in the range of  $10^{-4}$  -  $10^{-1}$  s<sup>-1</sup>. It 24 should be noted that in this study the dilution ratio was only 12, whereas in atmospheric 25 26 conditions it might be even more than 1000 at plume ages of 2.7 s (Kittelson et al., 1998, Du 27 and Yu, 2008). Typically, the nucleation mode has been fully formed at the dilution ratio of approximately 100 (Keskinen and Rönkkö, 2010) or after less than 0.7 s residence time in the 28 atmosphere (Rönkkö et al., 2007). The predicted GSA concentrations at the end of the ageing 29 chamber are  $1.2 \times 10^8$  cm<sup>-3</sup> and  $6 \times 10^6$  cm<sup>-3</sup> without and with the condensable organic vapour. 30

respectively. Unfortunately, these values cannot be compared with observations since only the
raw exhaust GSA concentration was measured.

Secondly, the newly formed particles are not able to grow to the measured sizes by sulphuric acid. At the end of the simulation, the modelled geometric mean diameter of the nucleation mode is only 5.5 nm. To reach the measured modal mean value of 13.7 nm the COV<sub>s</sub> concentration should be as high as  $8 \times 10^{12}$  cm<sup>-3</sup>. Consequently, the concentration of particles smaller than 40 nm covering the grown volatile and non-volatile nucleation mode particles is much higher than the observed one (Fig. 3b), the modelled total particle concentration N<sub>3</sub> (2.9x10<sup>8</sup> cm<sup>-3</sup>) strongly exceeds the measured value  $8 \times 10^6$  cm<sup>-3</sup>.

When the raw exhaust GSA concentration was  $4.4 \times 10^{11}$  cm<sup>-3</sup>, AEROFOR predicted the 10 maximum momentary nucleation rate of 3.9x10<sup>4</sup> cm<sup>-3</sup> s<sup>-1</sup> (Fig. S1). Although nucleation 11 continued for 2.2 s, it was not able to produce enough new particles. The final modelled N<sub>3</sub> 12 was  $6.8 \times 10^5$  cm<sup>-3</sup>, too small compared to the measured N<sub>3</sub> of  $6.6 \times 10^6$  cm<sup>-3</sup>. The sulphuric acid 13 concentration was not sufficient to grow the nucleated particles to the measured 11.2 nm 14 sizes. When increasing the  $COV_s$  concentration up to  $1 \times 10^{12}$  cm<sup>-3</sup>, the mean diameter of the 15 core mode was close to the measured 21 nm, however, the nucleation mode diameter (9 nm) 16 17 was still too small. On the other hand, higher  $COV_s$  concentrations let the core mode particles 18 grow too much.

When the measured raw exhaust GSA concentration was  $1.53 \times 10^{11}$  cm<sup>-3</sup>, the model did not predict any newly formed particles. This is inconsistent with the measurements which showed that the volatile nucleation mode was present since the GSA concentration exceeded  $1 \times 10^{10}$ cm<sup>-3</sup> (Fig. S2). Thus, we can conclude that the BHN mechanism cannot explain the measurements.

### 24 **3.1.2** Cluster activation and kinetic nucleation

The second set of simulations was performed by using the ACT mechanism for nine different initial GSA values selected from Fig. 2. The activation coefficient A and the COVs concentration were varied to find the best agreement with the modelled and measured particle size distributions at the end of the ageing chamber. The changes in these parameters affected the particle size distributions at the end of the ageing chamber so that an increase in A increased the nucleation mode particle concentration, whereas an increase in the  $COV_s$ concentration shifted the nucleation mode to larger sizes and simultaneously slightly decreased the nucleation mode concentration. As an example, Fig. 4 presents the results for all nucleation mechanisms studied in this research for the 100% engine load when the GSA concentration was stabilised to  $2.0x10^{12}$  cm<sup>-3</sup>, and  $COV_s = 6x10^{11}$  cm<sup>-3</sup>. Again, in the case when no condensable organic vapour was present the nucleation mode and even the core mode did not sufficiently grow.

With the ACT mechanism nucleation is not suppressed but the formation of 1.5 nm clusters 8 9 continues during the whole simulation time 2.7 s (Fig. S3). The formed clusters were activated to grow by sulphuric acid and COV<sub>s</sub>, however, the growth by sulphuric acid alone 10 was not sufficient (Fig. S3, dotted line). When the COV<sub>s</sub> was included, the N<sub>3</sub> at the end of the 11 ageing chamber was 9.3x10<sup>6</sup> cm<sup>-3</sup>, close to the measured value 6.6x10<sup>6</sup> cm<sup>-3</sup>. As seen from 12 13 Fig. 4, the model predicts higher concentration for the smallest particles of the nucleation mode than the measurements, thus indicating that the SMPS might underestimate the 14 15 concentration of the particles smaller than 10 nm. According to the manufacturer, the uncertainties in the SMPS measurement may be caused by the uncertainties in voltage and 16 17 flow accuracy, scan time, bi-polar charge distribution, CPC efficiency curve, DMA transfer 18 function, working gas, diffusion losses, and sampling and conditioning issues. Unfortunately, 19 in the studies reported by Arnold et al. (2012) and Rönkkö et al. (2013) the size distribution of 20 smallest particles was not measured by other methods than by the SMPS, and thus 21 experimental evidence on uncertainties in SMPS measurements of vehicle exhaust 22 nanoparticles is an issue for future studies (see Kuuluvainen et al., 2015).

For the other initial GSA values, the model was able to predict the measured size distributions as well. The estimated COV<sub>s</sub> concentration was close to  $10^{12}$  cm<sup>-3</sup> except in the cases when practically no nucleation occurred, i.e. for the GSA concentration smaller than around  $10^{10}$ cm<sup>-3</sup>. The results by Arnold et al. (2012, open diamonds in Fig. 4) indicate that at the 100% engine load the lower limit concentrations of all acidic gases (other than GSA) are  $3x10^{11}$  - $2x10^{12}$  cm<sup>-3</sup> for the GSA concentrations of  $4.4.x10^{11} - 2x10^{12}$  cm<sup>-3</sup>.

Based on our simulations, as the initial GSA concentration varied from  $2.8 \times 10^9$  to  $2 \times 10^{12}$  cm<sup>-3</sup> the activation coefficient A varied in the range of  $2.5 \times 10^{-5}$  -  $2 \times 10^{-3}$  s<sup>-1</sup> (Table 3 and Fig. 5a). Two orders of magnitude smaller values for A have been found in the ambient field measurements (e.g. Sihto et al. 2006, Paasonen et al, 2010) and in the laboratory measurements (Sipilä et al., 2010). It should be noted that the exhaust GSA concentrations are much higher than in the atmosphere, and the formation mechanism might be different as well. As seen from Table 3, the modelled total number concentrations (particles > 3 nm) were in good agreement with the measurements.

By using the KIN mechanism the kinetic coefficient K and condensable vapour concentration varied (Table 3). As an example, Fig. 4 presents the results for the 100% engine load with K = $5.5x10^{-17}$  cm<sup>3</sup> s<sup>-1</sup> and COV<sub>s</sub> =  $6x10^{11}$  cm<sup>-3</sup>. Also with this mechanism nucleation occurred continuously, but the nucleation rate decreased faster than with the ACT mechanism (Fig. S4). The concentrations of particles larger than 3 nm (N<sub>3</sub>) and size distributions were in good agreement with the measurements (Table 2). However, sulphuric acid alone was not sufficient to grow the particles to the detectable sizes.

As with the ACT mechanism, the nucleation coefficient K varied strongly as a function of the initial GSA concentration (Table 3 and Fig. 5b) with the KIN mechanism. However, during the steady state driving cycle (100% engine load), the measured raw exhaust parameters such as temperature, H<sub>2</sub>O concentration, RH, core and soot mode particle concentrations, were constant, only GSA varied, probably due to the storage effect in the ATS as mentioned in section 2.3. Therefore, it was expected that the nucleation coefficients A and K should have constant values when simulating the different cases within the same engine load.

## 20 **3.1.3 Heteromolecular nucleation.**

Finally, the fourth set of simulations was performed by assuming homogeneous heteromolecular nucleation between sulphuric acid and organic vapour molecules  $COV_s$ ) along with the homogeneous homomolecular nucleation of sulphuric acid. Paasonen et al. (2010) suggested that, besides organic vapours participate in the initial growth of the nucleated particles, they might also be involved in the nucleation process itself. The idea was recently supported by the results of the chamber measurements (e.g. Dal Maso et al., 2015).

The nucleation coefficients  $K_1$  and  $K_2$  of the HET mechanism were parameterized by using the results from the KIN mechanism, i.e. statistically by making a least square fit for the equation

1 
$$K[GSA]^2 = K_1[GSA]^2 + K_2[GSA][COV_s]$$
 (4)

where we assumed that the nucleation rates by the kinetic theory (left-hand side) and by the heteromolecular nucleation theory (right-hand side) were equal. This procedure resulted in constant values of  $3.8 \times 10^{-17}$  and  $5.6 \times 10^{-17}$  cm<sup>3</sup> s<sup>-1</sup> for K<sub>1</sub> and K<sub>2</sub>, respectively, independently of the initial GSA concentration, whereas the ACT and KIN mechanisms could not (Fig. 5)..

6 The GSA and  $\text{COV}_{s}$  concentrations for the HET nucleation (used in Eq. (4)) were the same as 7 for the KIN nucleation given in Table 3. Interestingly, the  $\text{COV}_{s}$  concentration was almost 8 constant, around  $1.7 \times 10^{12}$  cm<sup>-3</sup>, except for the two lowest GSA cases in which no nucleation 9 occurred, and with the extremely high GSA concentration in which case the particles could 10 notable grow by the GSA. However, the sensitivity of particle number size distribution 11 against the COV<sub>s</sub> concentration will be presented in Section 3.3.2.

12 Although both nucleation and condensation consumed the  $COV_s$ , its high concentration 13 ensured that the size distribution with the initial  $GSA=2.0x10^{12}$  cm<sup>-3</sup> and  $COV_s = 6.0x10^{11}$ 14 cm<sup>-3</sup> remained the same as presented for the KIN mechanism where  $COV_s$  was consumed 15 only by condensation (Fig. 4). This case is named hereafter the base case.

16 By using the same K<sub>1</sub> and K<sub>2</sub> values for the other initial GSA values (Table 1) the model was 17 able to predict the size distributions which were in good agreement with the experiments. The 18 modal mean diameters of the volatile nucleation mode coincided with the measured ones even 19 though the model predicted stronger NUP formation than measured if the GSA concentration 20 exceeded  $10^{11}$  cm<sup>-3</sup> (Fig. 6). In regard to the core mode the model overestimated the growth of particles and slightly underestimated their number concentration. The reason might be too 21 22 high water content of these non-volatile particles in the model. On the other hand, the SMPS 23 measured mobility diameters which do not grow in spite of substantial condensation occurs if 24 the particles are fractal-like as soot particles. We cannot exclude the possibility of fractal 25 structure of core particles, or condensation of organic vapours other than the nucleating 26 vapour.

The MAFOR model with somewhat different organic condensation processes predicted well the GMDs and number concentrations in the base case but underestimated the NUP concentrations at GSA below  $1 \times 10^{11}$  cm<sup>-3</sup>. The particle distribution in MAFOR is initially 1 non-hygroscopic (non-volatile core and soot particles) and becomes increasingly hygroscopic

2 through condensation of GSA and COV<sub>s</sub>.

## 3 **3.2 Mass size distribution**

As mentioned above, additional model simulations for the base case (raw exhaust 4  $GSA=2x10^{12}$  cm<sup>-3</sup>) were carried out by the MAFOR model. With MAFOR it is possible to 5 6 track the mass composition of each size bin during the simulation. Fig. 7 shows the time 7 development of the number size distribution and Fig. 8 the mass and composition size 8 distributions. The initial raw exhaust particle distribution at t=0.0 s was assumed to be entirely non-hygroscopic. It was divided into the core mode between 5-15 nm consisting of non-9 10 volatile organic matter (OM<sub>nv</sub>) and the soot mode consisting of elemental carbon. With the initial concentrations of  $COV_s$  and  $COV_1$  of  $2.7 \times 10^{12}$  cm<sup>-3</sup> and  $5.0 \times 10^{12}$  cm<sup>-3</sup>, respectively, 11 12 MAFOR predicted the mean modal diameter of the volatile mode after 2.7 s simulation in good agreement with the observed one. The initial concentration of COVs was higher than in 13 the base case simulation with AEROFOR ( $COV_s = 6.0 \times 10^{11} \text{ cm}^{-3}$ ), likely due to the different 14 hygroscopic properties of COV<sub>s</sub> used in the models. The hygroscopic properties of COV<sub>s</sub> in 15 MAFOR were that of sodium succinate, and due to low RH (<16%) in the experiment COVs 16 did not uptake water. In addition of COV<sub>s</sub>, COV<sub>1</sub> was needed in MAFOR to predict the 17

18 observed growth as discussed in section 2.2.

During the dilution stage, rapid nucleation of GSA and COVs occurred to form a new volatile 19 particle mode with GMD at ~2 nm at 0.1 s (red lines in Fig. 7). By condensation of sulphuric 20 21 acid and COV<sub>s</sub> the exhaust particles became more hygroscopic. The growth of the volatile 22 nucleation mode was promoted by condensation of COV<sub>1</sub> in the MAFOR simulation. Core 23 mode composition at 0.1 s (mass fraction in percentage) was 4.5% OM<sub>nv</sub>, 18.9% sulphuric acid, 2.1% semi-volatile organic matter (OMs), 32.2% extremely low-volatile organic matter 24 25 (OM<sub>1</sub>), and 41.3% water. In the ageing chamber, the volatile and core modes grew further by condensation of GSA, COV<sub>s</sub>, COV<sub>1</sub> and water. Nucleation by the HET mechanism 26 continuously produced new particles which were scavenged or grown to larger particles. The 27 total particle mass increased from 3.5 µg m<sup>-3</sup> at 0.1 s to 28.2 µg m<sup>-3</sup> at 0.9 s, and further to 28 116.8 µg m<sup>-3</sup> after 2.7 s. At 0.9 s GMD of the volatile mode and core mode increased to 8-9 29 nm and ~20 nm, respectively. The percentage mass fraction of condensed organic matter 30

increased to 55.5% while that of water and sulphuric acid decreased to 29.9% and 13.7%,
 respectively.

At the end of the simulation (2.7 s) the measured GMDs of the volatile and core modes were 13.1 nm and 24.7 nm, respectively, closely matched by the models. Both models underestimated particle number concentrations of the core mode.

6 The modelled mass fractions of the final exhaust particle composition are given in Table 4. 7 According to MAFOR, the final mode of particles with a non-volatile core consisted of 78.0% 8 condensed organic matter, 6.8% sulphuric acid and 15.0% water. The ratio OMI/OMs 9 decreased from the volatile nucleation mode to the soot mode (volatile nucleation mode: 6.82, 10 core mode: 6.55, soot mode: 5.74) since uptake of COVs to the nucleation mode was more limited by the Kelvin effect than uptake of COV<sub>1</sub> due to its extremely low vapour pressure. 11 12 The decreasing trend of OM<sub>1</sub>/OM<sub>s</sub> was rather moderate, because the uptake of COV<sub>s</sub> was only affected by the Kelvin effect for particles <3 nm which do not significantly contribute to the 13 14 mass. Initially present non-volatile organic particles formed the nuclei for the condensation of 15 gas-phase vapours in the core mode. However,  $OM_{nv}$  contributed negligible to the final mass of the core mode. MAFOR probably underestimated the water content of the exhaust particles 16 17 by assuming that COV<sub>1</sub> was non-hygroscopic.

## 18 **3.3 Sensitivity analysis**

The sensitivity of particle number size distribution against the dilution time constant,
condensable organic vapour concentration, and engine load were tested by AEROFOR for the
base case.

## 22 **3.3.1 Effects of dilution time constant**

After 0.1 s the exhaust enters into the ageing chamber. If the dilution time constant  $\tau_d$ increases from 0.12 s (base case) to e.g. 0.5 s, the dilution of exhaust gases continues further in the ageing chamber than for the base case. It should be noted that dilution only occurs when the simulation time is less than  $\tau_d$ . Due to the slower momentary dilution rate, the gas concentrations are at first higher leading to stronger nucleation and new particle formation (Fig. 9). However, simultaneously the condensation sink of pre-existing and nucleated particles grows consuming both gases more efficiently, and after 0.4 s from the beginning the gas concentrations and nucleation rate become lower than those of the base case. After that the growth rate of particle number concentration depletes and stabilizes to a somewhat smaller number as in the base case. Fig. 9c shows that in general, the modal sizes of the final distribution are rather close to that of the base case but their concentrations are lower.

5 When the time constant decreases to 0.075 s, all dilution occurs before the exhaust enters into 6 the ageing chamber. This leads to a very fast reduction of the gas concentrations, and 7 subsequently decreases the nucleation and total condensation. Therefore, the final gas 8 concentrations remain higher unlike the particle concentration and their sizes that are smaller 9 than in the base case. The laboratory studies by Mathis et al., (2005) showed that dilution 10 conditions such as the dilution ratio, temperature and relative humidity of the dilution air 11 strongly affect the formation of volatile nucleation mode.

### 12 **3.3.2 Effects of condensable organic vapour**

The used initial  $COV_s$  concentrations were  $10^{10}$  cm<sup>-3</sup> and  $10^{12}$  cm<sup>-3</sup>. Fig. S5 illustrates the 13 14 number size distribution as a function of COV<sub>s</sub> concentration. As expected, an increase in COV<sub>s</sub> concentration increases the nucleation rate and new particle production. 15 Simultaneously, the enhanced condensation of GSA and COVs consumes these vapours, and 16 17 after 1.2 s the nucleation rate dramatically drops, the particle number concentration stabilizes, but particles still continue growing in size. All in all, the final nucleation mode accounts for 18 19 too many particles, around 3-fold compared with the base case, and besides this mode has 20 grown so much that it totally covers the core mode. In fact, the geometric mean diameter of 21 the mode was doubled up to 25 nm. The situation is vice versa, if the COV<sub>s</sub> concentrations is 22 decreased. The nucleated particle concentration remains too low and they do not grow 23 sufficiently to reach the measured sizes.

With MAFOR we tested how much the different concentrations of COVs and COV<sub>1</sub> influenced the particle number size distribution evolution. When the COV<sub>1</sub> concentration was reduced from  $5.0 \times 10^{12}$  cm<sup>-3</sup>, the GMD of the volatile mode of the size distribution after 2.7 s shifted to a smaller size and the maximum concentration of that mode was lower than in the base case. Fig. S6 depicts the case when COV<sub>1</sub> was set to zero (green line). In that case MAFOR predicted the GMD of 10.7 nm for the volatile mode whereas the measured value was 13.1 nm. When MAFOR used the same hygroscopic properties for COV<sub>s</sub> as AEROFOR,

i.e. the water uptake of COV<sub>s</sub> was similar as sulphuric acid (red line in Fig. S6), the resulting 1 2 GMD of the volatile mode was in agreement with AEROFOR and with the measured 3 diameter. The differences for the number concentration of small particles below 9 nm 4 diameter were probably due to higher coagulation rates in MAFOR. In both tests, the growth 5 of large particles (>200 nm diameter) was overestimated due to the enhanced water uptake of the soot mode. When the Kelvin effect was excluded for COVs in the latter case, there were 6 7 little or no particles below 3 nm because these nucleated particles were able to grow to larger 8 sizes by passing the Kelvin barrier (Fig. S6, dotted black line). Consequently, the volatile 9 mode showed a little higher maximum peak concentration compared to the case when the 10 Kelvin effect was included.

## **3.3.3 Effects of pre-existing non-volatile core particles**

The base case simulation was repeated for different concentrations of initial soot and core 12 particles. As mentioned earlier, these non-volatile particles were formed during the 13 14 combustion process, and engine technology along with combustion optimization, fuel and lubricant oil compositions, after-treatment systems, and engine load affect their formation and 15 concentrations. Lähde et al. (2010) found out that while the non-volatile soot mode 16 17 concentration decreased, the non-volatile nucleation mode concentration increased for a heavy duty diesel engine. In these simulations the initial non-volatile soot mode concentration varied 18 19 between  $1.1 \times 10^6$  and  $6.8 \times 10^7$  cm<sup>-3</sup>, and the soot mode between  $2.6 \times 10^5$  and  $1.5 \times 10^7$  cm<sup>-3</sup> (Fig. 10 a) while the geometric mean diameters and standard deviations of the modes remained 20 21 constant as given by Table 1.

22 Fig. 10b shows the nucleated particle (NUP) concentration at the end of the ageing chamber 23 as a function of the condensation sink (CS) of pre-existing soot and core particles. The NUP concentration was manually calculated or if possible, determined by fitting three modes on the 24 25 final size distribution (Hussein et al., 2005). It is obvious that while the CS decreases the NUP concentration increases. If  $CS \ge 1$  s<sup>-1</sup>, the NUP concentrations linearly depend on the 26 logarithm of the CS. This occurs if the initial dry soot mode concentration is larger than 27  $1.0 \times 10^6$  cm<sup>-3</sup> and the core mode concentration larger than  $1.5 \times 10^7$  cm<sup>-3</sup>. It should be noted that 28 due to small sizes the effect of the core mode on the CS is small indeed. The maximum NUP 29 concentration is  $1.7 \times 10^7$  cm<sup>-3</sup> when the CS is zero. This corresponds to cases in which 30 31 vehicles are equipped with modern diesel particle filters (DPF), the efficiency of those in solid particle number reduction is nowadays even 99.9%. The NUP formation is ceased if the CS is as high as 52 s<sup>-1</sup>. This occurs if the soot mode and core mode concentrations at hot exhaust (696 K) are for example,  $6.8 \times 10^7$  and  $2.6 \times 10^5$  cm<sup>-3</sup>, respectively, with the modal sizes as given in Table 1.

5 These results also indicate that a reduction in non-volatile particle concentrations as a result of 6 modern engines and particle filters actually enhance the nucleation and volatile particle 7 emissions as also discovered by Du and Yu (2006).

## 8 3.3.4 Effects of engine load

9 Driving conditions at 100% and 75% engine loads had minor effects on the number 10 concentrations of soot mode and core mode particles (Table 1) whereas at 50% engine load 11 the soot mode concentration was significantly lower and core mode concentration higher than 12 at the higher loads leading to much lower condensation sink of 2.5 s<sup>-1</sup> (Fig. 10b). 13 Additionally, due to lower temperatures at lower loads the SO<sub>2</sub> to SO<sub>3</sub> conversion in the catalyst is less efficient, and subsequently the GSA concentration remains lower, in the 14 stabilised phase  $3x10^{11}$  cm<sup>-3</sup> (Fig. 2). This, in turn, led to lower NUP formation, in maximum 15 3.4x10<sup>6</sup> cm<sup>-3</sup> at the end of the simulation. At a 50% engine load no NUP formation was 16 17 predicted.

### 18 **3.4 Effect of FSC**

The aim of the last set of simulations was to find the initial GSA concentration when 19 nucleation is ceased at 100% engine load (T=697 K) for the base case (CS=3.5 s<sup>-1</sup>) and for the 20 case when all non-volatile particles were filtered (CS=0 s<sup>-1</sup>). The highest GSA value of  $2x10^{12}$ 21 cm<sup>-3</sup> was reached when the engine was operated by diesel with the FSC of 36 ppm (Fig. 11). 22 23 It should be noted that the GSA concentration depends also on the sulphur content of the lubricant oil. If the DPF was used, the NUP concentration was 1.9x10<sup>7</sup> cm<sup>-3</sup>, two times higher 24 25 than for the pDPF. In both cases, the predicted NUP concentrations decreased with lower GSA concentrations, and ceased when the GSA concentration was around 10<sup>10</sup> cm<sup>-3</sup>. This 26 value corresponds to the usage of biofuel with FSC < 1 ppm as seen from Fig. 3 in Arnold et 27 28 al. (2012). On the other hand, the GSA concentration of  $3 \times 10^{11}$  cm<sup>-3</sup> was measured by Arnold et al (2012) when the FSC was 6 ppm. As seen from Fig. 11, the NUP formation does not 29

1 depend linearly on the GSA concentration. For example, when decreasing the GSA 2 concentration by 85% from  $2 \times 10^{12}$  to  $3 \times 10^{11}$  cm<sup>-3</sup> the NUP concentrations decreases only 15-3 25%.

4

## 5 4 Concluding Remarks

6 Although our model simulations cover the exhaust particle formation and growth during the 7 laboratory sampling, the results might be generalized to concern the atmospheric conditions 8 as well. It is well-known that nucleation mode formation at the laboratory tests is very 9 sensitive to the dilution conditions (Khalek et al, 2003, Mathis et al., 2004). However, our on-10 road and laboratory measurements (Rönkkö et al., 2006, 2007) showed that the volatile 11 nucleation mode was already formed in the atmosphere in less than 0.7 seconds, at closer than 12 10 m distance from the exhaust pipe, and that the dilution system along with the ageing 13 chamber used in these measurements mimics reasonably well the real-world conditions and 14 size distributions measured on-road. The exhaust plume age of 0.4-0.7 s in the atmosphere 15 corresponds to the atmospheric dilution ratio of approximately 200-400 (Kittelson et al., 1998). 16

17 The aerosol dynamics models used in this research are process models that describe the main aerosol processes in details. They use sectional representations for particle size distributions 18 19 with at least 100 size sections to prevent numerical diffusion and are free from assumptions of 20 lognormal particle modes that are used in modal models. Several nucleation mechanisms and 21 their potential to predict particle formation in diesel exhaust were investigated. The best fit 22 with the measurements was predicted by the HET nucleation mechanism in which both sulphuric acid and semi-volatile organic acid molecules participate. Nucleation occurred 23 24 continuously in the ageing chamber producing stable clusters of 1.5 nm in size. Due to the competition of coagulation and condensation, these freshly formed particles were scavenged 25 26 or grew to larger sizes. The nucleation rate decreased as a function of elapsed time due to the 27 increased condensation sink and subsequent reduction of the nucleating vapours. However, at the end of the simulation at 2.7 s, the model predicted  $2.8 \times 10^5$  particles per cm<sup>3</sup> in the size 28 range of 1.5-3 nm at 100% engine load, and 3.0x10<sup>5</sup> cm<sup>-3</sup> at 75% engine load. These results 29 suggest a hypothesis that diesel exhaust might yield a reservoir of small clusters that might be 30

activated to grow to even cloud condensation nuclei (CCN) sizes if sufficient amounts of
 condensable vapours are present.

3 According to the model simulations, it was discovered that the semivolatile organic vapour COV<sub>s</sub> mostly accounted for the nucleation particle growth since GSA alone was not 4 5 sufficient. MAFOR predicted that the aged exhaust particles contained 9-10% COVs and 6-7% sulphuric acid in terms of mass. The required COV<sub>s</sub> concentrations in both models were as 6 high as  $(0.6-1.8) \times 10^{12}$  cm<sup>-3</sup> in the raw exhaust. In that case the modern DOC does not prevent 7 totally the formation of organic condensable vapours. The COV<sub>s</sub> concentration at the end of 8 the simulation was around  $1.1 \times 10^{11}$  cm<sup>-3</sup> at 100% engine load and  $6.5 \times 10^{10}$  cm<sup>-3</sup> at 75% 9 engine load. This indicates that diesel exhaust also emits precursor vapours for secondary 10 11 organic aerosol as reported by Robinson et al. (2007).

Despite the recognized health and climate effects of particle emissions the volatile nucleation 12 mode particles emitted from diesel engines are not regulated. To fulfill the Euro 6 standards 13 14 new diesel vehicles have to be equipped with DPFs which remove core and soot mode particles. However, based on the model simulations the NUP concentration at high load can 15 be  $1.7 \times 10^7$  cm<sup>-3</sup> if the raw exhaust GSA concentration was  $2 \times 10^{12}$  cm<sup>-3</sup>. The GSA 16 concentration depends not only on the sulphur contents of fuel and lubricant oil, but also on 17 the driving history of the engine. Decreasing the FSC from 36 ppm to 6 ppm the GSA 18 concentration decreased 85% from  $2x10^{12}$  to  $3x10^{11}$  cm<sup>-3</sup>, and the subsequent decrease in the 19 NUP concentration was 15-25%. The NUP formation was in practice suppressed if the GSA 20 concentration was below 10<sup>10</sup> cm<sup>-3</sup>. This requires the use of biofuel. Also the development of 21 22 lubricant oil additives might reduce their sulphur content and subsequent particle emissions.

## 23 Supplementary material related to this article is available online

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## 1 Tables

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Table 1. Lognormal parameters (number concentration N, geometric mean diameter D<sub>g</sub>,
standard deviation σ) for non-volatile exhaust particles and GSA concentration in raw exhaust
at different engine loads and exhaust temperatures. Index 1 refers to the core mode and index

6 2 to the soot mode.

Engine load	Т	GSA	$N_1$	D <sub>g1</sub>	$\sigma_1$	$N_2$	D <sub>g2</sub>	$\sigma_2$
(%)	(K)	$(cm^{-3})$	$(cm^{-3})$	(nm)		$(cm^{-3})$	(nm)	
		$\times 10^{10}$	x10 <sup>6</sup>			x10 <sup>6</sup>		
100	697	0.28	1.66	8.8	1.25	1.96	49	2.15
100	697	0.34	1.66	8.8	1.25	1.96	49	2.15
100	697	1.36	1.66	8.8	1.25	1.96	49	2.15
100	697	4.17	1.66	8.8	1.25	1.96	49	2.15
100	697	9.75	1.66	8.8	1.25	1.96	49	2.15
100	697	15.3	1.66	8.8	1.25	1.96	49	2.15
100	697	26.6	1.66	8.8	1.25	1.96	49	2.15
100	697	44.0	1.66	8.8	1.25	1.96	49	2.15
100	697	201	1.66	8.8	1.25	1.96	49	2.15
75	657	11.5	1.53	8.4	1.26	1.79	49	1.98
75	657	25.0	1.53	8.4	1.26	1.79	49	1.98
75	657	30.2	1.53	8.4	1.26	1.79	49	1.98
50	618	11.1	0.427	7.5	1.23	5.34	56	1.87

7

- 8 Table 2. Physical properties of the condensable vapours. COV<sub>s</sub> was used in AEROFOR
- 9 whereas  $COV_s$  and  $COV_1$  were used in MAFOR.

	p <sup>0</sup> (298 K) (Pa)	molar weight (g/mol)	surface tension (298 K) (N/m)	hygroscopic	nucleation
COVs	1.63x10 <sup>-5a</sup>	146	0.34 <sup>b</sup>	yes	yes
$COV_1$	5.0x10 <sup>-11c</sup>	478	d	no	no

10 <sup>a</sup> Bilde et al., 2003

<sup>b</sup> Riipinen et al., 2007

<sup>c</sup> Lemmon and Goodwill, 2000

<sup>13</sup> <sup>d</sup> Kelvin effect not considered: Ke=1 (due to low vapor pressure)

14

- 1 Table 3. Initial condensable organic vapour concentrations (COV<sub>s</sub>) and activation coefficient
- 2 (A) as well as the initial  $COV_s$  and kinetic coefficient (K) as a function of the initial gaseous
- 3 sulphuric acid concentration (GSA). For heterogeneous nucleation GSA, COV<sub>s</sub> and N<sub>3fin</sub> are
- 4 as for kinetic nucleation but  $K_1 = 3.8 \times 10^{-17}$  and  $K_2 = 5.6 \times 10^{-17}$  cm<sup>3</sup> s<sup>-1</sup> for each case.

measured	cluster activ	vation	kinetic nucleation				measured
GSA	$COV_s$	А	$N_{3fin}$	COVs	Κ	$N_{3fin}$	$N_3$
$(cm^{-3})$	$(cm^{-3})$	$(s^{-1})$	$(cm^{-3})$	$(cm^{-3})$	$(cm^3 s^{-1})$	(cm <sup>-3</sup> )	$(cm^{-3})$
2.76E+09	6.00E+10	2.00E-03	6.88E+05	4.00E+10	1.00E-12	6.84E+05	7.69E+05
3.41E+09	8.00E+10	2.00E-03	6.93E+05	8.00E+10	5.00E-13	7.52E+05	1.03E+06
1.36E+10	1.25E+12	1.00E-03	3.54E+06	1.50E+12	5.00E-14	3.16E+06	3.13E+06
4.17E+10	1.50E+12	5.50E-04	5.97E+06	1.70E+12	4.00E-15	5.08E+06	4.61E+06
1.53E+11	1.60E+12	2.00E-04	7.34E+06	1.70E+12	7.00E-16	5.79E+06	5.33E+06
4.40E+11	1.80E+12	9.00E-05	9.36E+06	1.70E+12	2.50E-16	7.10E+06	6.57E+06
2.01E+12	1.00E+12	2.50E-05	1.14E+07	6.00E+11	5.50E-17	9.52E+06	8.03E+06

- 6 Table 4. Mass fractions of particle components at 2.7 s obtained from simulation by MAFOR
- 7 with initial  $GSA = 2x10^{12}$  cm<sup>-3</sup>. OM<sub>s</sub>, OM<sub>l</sub> and OM<sub>nv</sub> refer to semi-volatile, low volatile and
- 8 non-volatile organic matter.

	Volatile	Core	Soot
	Nucleation	Mode	Mode
	Mode		
H <sub>2</sub> O	0.128	0.150	0.116
$H_2SO_4$	0.058	0.068	0.053
OM <sub>s</sub>	0.104	0.103	0.092
$OM_1$	0.710	0.676	0.531
$OM_{nv}$	0.000	0.002	0.000
SOOT	0.000	0.000	0.208
ТОТ	1.000	1.000	1.000

9

## 1 Figures

Figure 1. Schematic figure of diluting a ageing exhaust. ATS = after-treatment system, PD = porous diluter (12:1), AC = ageing chamber with the volume of 2.4 dm<sup>3</sup>, EJ = ejector diluter (8:1). Red circles refer to temperature measurements. Exhaust flow rate through the dilution/sampling system was kept constant 55 lpm.

Figure 2. a) Time series of the concentrations of GSA (black curve) along with standard
deviations (light blue shaded area), and particles larger than 3 nm (red crosses) in the raw
exhaust as a function of engine load (dotted grey bars) at 1800 rpm. Also shown is the exhaust
temperature (blue crosses).

Figure 3. (a) Time evolution of particle number concentration (N<sub>3</sub>), gaseous sulphuric acid (GSA) and condensable organic vapour (COV<sub>s</sub>) in cm<sup>-3</sup>, as well as nucleation rate (I) in cm<sup>-3</sup> s<sup>-1</sup> by the BHN mechanism, (b) Measured (black) and modelled (red) particle number size distribution at the end of the ageing chamber. (c) Condensation sink for sulphuric acid. Initial  $GSA=2x10^{12}$  cm<sup>-3</sup>,  $COV_s=8x10^{12}$  cm<sup>-3</sup> and  $COV_s=0$ .

Figure 4. Comparison of measured and modelled particle size distributions, considering different nucleation mechanisms. Engine load was 100%, initial GSA =  $2.0 \times 10^{12}$  cm<sup>-3</sup>, COV<sub>s</sub> =  $6 \times 10^{11}$  cm<sup>-3</sup> except for BHN it was  $8 \times 10^{12}$  cm<sup>-3</sup>. The simulation time was 2.7 s. Black squares refer to the measured size distribution by the SMPS after the ageing chamber.

Figure 5. Nucleation coefficients as a function of GSA and  $COV_s$  concentrations when the nucleation mechanism was ACT (a), KIN and HET (b).

Figure 6. Mean diameters (GMD) (a) and number concentration of particles > 3 nm (b) at the end of the simulation for the volatile nucleation mode and the core mode. The nucleation mechanism for these simulations was HET. Also shown are the measured values at the end of the ageing chamber.

Figure 7. Number size distribution (dN/dlogDp in particles cm<sup>-3</sup>) at different stages of the exhaust (t=0.0 s, black lines; t=0.1 s, red lines; t=0.9 s, green lines; t=2.7 s, blue lines) as modelled by AEROFOR (lines with open squares) and by MAFOR (dashed lines) together with the SMPS measurement at 2.7 s (blue open diamonds). Initial size distribution with the core mode at 10 nm and soot mode at 49 nm. The nucleation mechanism for these simulations
 was HET.

Figure 8. Mass composition distribution (dM/dlogDp in ng m<sup>-3</sup>) at different stages of the 3 exhaust (initial at t=0.0 s, after dilution t=0.1 s, in the ageing chamber t=0.9 s, and final t=2.7 4 5 s) modelled by MAFOR. Includes the total mass concentration (green line) and the mass distributions of non-volatile organic matter (OM<sub>nv</sub>, red dashed line with open circles), soot 6 7 (black dashed line), sulphuric acid (black dash-dotted line), semi-volatile organic matter (OM<sub>s</sub>, black dashed line with open circles), extremely low-volatile organic matter (OM<sub>1</sub>) as 8 9 well as the mass distribution of water (blue dashed line). The nucleation mechanism for these 10 simulations was HET.

Figure 9. Effects of time constant ( $\tau_d$ ) on time evolution of gases (a), particle number and nucleation rate (b) and number size distribution (c)-(e), where particle number concentration in cm<sup>-3</sup> is shown by color bar. In a) and b), solid curves refer to  $\tau_d = 0.12$  s (base case), dotted curves to  $\tau_d = 0.5$  s, and dasdotted curves to  $\tau_d = 0.075$  s. The nucleation mechanism for these simulations was HET.

Figure 10. a) Initial soot and core mode concentrations. The legend shows the corresponding condensation sinks in s<sup>-1</sup>. b) Nucleated particle concentration (NUP) at the end of the simulation as a function of initial condensation sink for 100% engine load with  $GSA = 2x10^{12}$ cm<sup>-3</sup> and raw exhaust T= 697 K. Also shown in (b) are the results for 75% engine load with GSA=.3x10<sup>11</sup> cm<sup>-3</sup> and raw exhaust T= 657 K. Back dots refer to the base cases.

Figure 11. Nucleated particle concentration (NUP) at the end of the simulation as a function of initial GSA concentration for 100% engine load. The initial core and soot mode concentrations were as in the base case (CS= $3.5 \text{ s}^{-1}$ ) or zero (CS= $0 \text{ s}^{-1}$ ). The nucleation mechanism for these simulations was HET.

# 1 Figures



Figure 1. Schematic figure of diluting and ageing exhaust. ATS = after-treatment system, PD
= porous diluter (12:1), AC = ageing chamber with the volume of 2.4 dm<sup>3</sup>, EJ = ejector diluter
(8:1). Red circles refer to temperature measurements. Exhaust flow rate through the
dilution/sampling system was kept constant 55 lpm.





Figure 2. a) Time series of the concentrations of GSA (black curve) along with standard
deviations (light blue shaded area), and particles larger than 3 nm (red crosses) in the raw
exhaust as a function of engine load (dotted grey bars) at 1800 rpm. Also shown is the exhaust
temperature (blue crosses).



Figure 3. (a) Time evolution of particle number concentration (N<sub>3</sub>), gaseous sulphuric acid (GSA) and condensable organic vapour (COV<sub>s</sub>) in cm<sup>-3</sup>, as well as nucleation rate (I) in cm<sup>-3</sup> s<sup>-1</sup> by the BHN mechanism. <u>Solid lines refer to  $COV_s=8x10^{12}$  cm<sup>-3</sup> and dashed lines to</u> <u> $COV_s=0$ .</u> (b) Measured (black) and modelled (red) particle number size distribution at the end of the ageing chamber. (c) Condensation sink for sulphuric acid. Initial GSA= $2x10^{12}$  cm<sup>-3</sup>,  $COV_s=8x10^{12}$  cm<sup>-3</sup> and  $COV_s=0$ .



3

Figure 4. Comparison of measured and modelled particle size distributions, considering different nucleation mechanisms. Engine load was 100%, initial GSA =  $2.0 \times 10^{12}$  cm<sup>-3</sup>, COV<sub>s</sub>= $6 \times 10^{11}$  cm<sup>-3</sup> except for BHN it was  $8 \times 10^{12}$  cm<sup>-3</sup>. The simulation time was 2.7 s. Black squares refer to the measured size distribution by the SMPS after the ageing chamber.

a)



6 Figure 5. Nucleation coefficients as a function of GSA and  $COV_s$  concentrations when the 7 nucleation mechanism was ACT (a), KIN and HET (b).



2 a)



Figure 6. Mean diameters (GMD) (a) and number concentration of particles > 3 nm (b) at the
end of the simulation for the volatile nucleation mode and the core mode. Also shown are the
measured values at the end of the ageing chamber. The nucleation mechanism was HET.



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Figure 7. Number size distribution (dN/dlogDp in particles cm<sup>-3</sup>) at different stages of the exhaust (t=0.0 s, black lines; t=0.1 s, red lines; t=0.9 s, green lines; t=2.7 s, blue lines) as modelled by AEROFOR (lines with open squares) and by MAFOR (dashed lines) together with the SMPS measurement at 2.7 s (blue open diamonds). Initial size distribution with the core mode at 10 nm and soot mode at 49 nm. The nucleation mechanism for these simulations was HET.





Figure 8. Mass composition distribution (dM/dlogDp in ng m<sup>-3</sup>) at different stages of the exhaust (initial at t=0.0 s, after dilution t=0.1 s, in the ageing chamber t=0.9 s, and final t=2.7 s) modelled by MAFOR. Includes the total mass concentration (green line) and the mass distributions of non-volatile organic matter (OM<sub>nv</sub>, red dashed line with open circles), soot (black dashed line), sulphuric acid (black dash-dotted line), semi-volatile organic matter (OM<sub>s</sub>, black dashed line with open circles), extremely low-volatile organic matter (OM<sub>l</sub>) as well as the mass distribution of water (blue dashed line). The nucleation mechanism for these simulations was HET.



6 Fig. 9. Effects of time constant ( $\tau_d$ ) on time evolution of gases (a), particle number and 7 nucleation rate (b) and number size distribution (c)-(e), where particle number concentration 8 in cm<sup>-3</sup> is shown by color bar. In a) and b), solid curves refer to  $\tau_d = 0.12$  s (base case), dotted 9 curves to  $\tau_d = 0.5$  s, and dasdotted curves to  $\tau_d = 0.075$  s. The nucleation mechanism for these 10 simulat





Fig. 10. a) Initial soot and core mode concentrations. The legend shows the corresponding condensation sinks in s<sup>-1</sup>. b) Nucleated particle concentration (NUP) at the end of the simulation as a function of initial condensation sink for 100% engine load with  $GSA = 2x10^{12}$ cm<sup>-3</sup> and raw exhaust T= 697 K. Also shown in (b) are the results for 75% engine load with GSA=.3x10<sup>11</sup> cm<sup>-3</sup> and raw exhaust T= 657 K. Back dots refer to the base cases. The nucleation mechanism for these simulations was HET.

11



2

Fig. 11. Nucleated particle concentration (NUP) at the end of the simulation as a function of initial GSA concentration for 100% engine load. The initial core and soot mode concentrations were as in the base case (CS= $3.5 \text{ s}^{-1}$ ) or zero (CS= $0 \text{ s}^{-1}$ ). The nucleation mechanism for these simulations was HET.