A miniature Portable Emissions Measurement System (PEMS) for real-driving monitoring of motorcycles

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Abstract.

We present an exploratory study carried out with a new miniature portable emission measurement system (Mini-PEMS) specifically designed at the Technical University of Liberec (CZ) for applications on 2-wheeler vehicles owing to its reduced

- 15 size (45 x 30 x 20 cm) and weight (≈ 15 kg). It measures the exhaust gas concentrations of hydrocarbons, carbon monoxide and dioxide with non-dispersive infrared method, nitrogen mono- and di-oxides and oxygen using an electrochemical cell. In addition, the instrument acquires the engine speed, the manifold absolute pressure, the inlet and exhaust gas temperature, the geo-localization and vehicle speed. The exhaust mass flow rate is calculated from engine and emission data. The Mini-PEMS was validated on three 2-wheelers (1 moped and 2 motorcycles) against laboratory-grade instrumentation in the
- 20 Vehicle Emissions Laboratory of the European Commission in terms of measured concentrations, exhaust flow, fuel consumption and mass emission of pollutants. The mean absolute deviations of gas concentrations were 8% for HC, 8% for CO, 13% for NO_x and 2% for CO₂ while the mass emissions (which include the exhaust flow determination uncertainty) were 7% for HC, 7% for CO, 9% for NO_x and 5% for CO₂. An agreement of 2% was achieved between the fuel consumption measured in the laboratory and calculated by the Mini-PEMS. As an application, the instrument was tested on board of the
- 25 vehicles during on-road trips. The emissions measured on-road were consistent among repeated runs, with differences between laboratory and on-road tests much larger than those between Mini-PEMS and laboratory. We found similar or larger HC and NOx real-driving emissions, larger CO from motorcycles and smaller for the moped. Considering its size and weight, the Mini-PEMS proved to be an efficient tool for vehicle monitoring, research and development and could be tested for in-service monitoring applications related to carbon monoxide and nitrogen oxides emissions. A tentative approach to
- 30 characterize particulate mass and particle number was presented and compared to the existing filter method and non-volatile particle number protocol.



1 Introduction

Exhaust emissions from internal combustion engines remain to be one of the primary source of air pollution in populated areas, and are believed to be responsible in the European Union (EU) for an order of magnitude more premature deaths than traffic accidents (EEA, 2018).

- 5 Two wheelers such as mopeds and motorcycles are known to be strong emitters of particulate matter, hydrocarbons and carbon monoxide and their contribution to air pollution can be amplified by their mode of use, mainly urban and at cold engine conditions (e.g., Kumar et al., 2011; Platt et al., 2014 and references therein). In addition, the aged exhaust emissions from 2-stroke mopeds were demonstrated to be active in the production of secondary organic aerosols, so that the term "asymmetric pollution" was introduced to describe the low share of the total vehicle fleet along with the large contribution to
- 10 air pollution (Platt et al., 2014). The use of alkylated fuels with only trace content of aromatic compounds (< 1% vol/vol concentration compared to 29–35% vol/vol concentration in standard gasoline) proved to be extremely beneficial in terms of particulate emissions and secondary aerosol formation as demonstrated by Zardini et al. (2014). Improvements in engines and exhaust after-treatment technology for 2-wheelers and recent legislative development</p>

(introduction of Euro 3 emission standards for mopeds in 2014 and Euro 4 for all 2-wheelers in 2016-2018) have considerably enlarged the distribution width of emissions (Clairotte et al., 2016). As a result, the circulating fleet of 2-

- wheelers is very heterogeneous in terms of exhaust emissions, including older Euro 2 mopeds (registered in the period 2002-2013) together with the new Euro 4 motorcycles (introduced in 2016). In addition, the presence of tampered vehicles which are modified for better performance by acting on the propulsion unit and/or after treatment system may further increase the emission distribution width (Zardini et al., 2016a).
- 20 Exhaust emissions from vehicles need to be carefully addressed during laboratory type-approval tests, but they generally tend to be higher during real-driving conditions because of various factors such as driving style (maximum speed, accelerations, and gear-shift strategy), ambient conditions (e.g., temperature, humidity, wind, altitude, and road friction), engine and vehicle general conditions (e.g., tyre pressure, additional weight, aging of the after-treatment system) (Weiss et al., 2011). In order to reduce the discrepancy between real-driving emissions (RDE) and type-approval emissions, the
- 25 characterization of RDE using portable emissions monitoring systems (PEMS) has been introduced into the United States and EU legislation for heavy duty vehicles and passenger cars (US-EPA, 2005; EC, 2011; EC, 2012; EC, 2017a; EC, 2018). The EU type-approval legislation has been recently updated for what concerns 2-wheelers, tricycles and quadricycles such as mini cars and quads (EC, 2013; EC, 2014). These vehicles are grouped in the so called L-category family for which two environmental packages were introduced: Euro 4 from 2016 and Euro 5 from 2020. Additional features to be assessed for
- 30 post-Euro 5 environmental measures are stipulated in recital 12 of Regulation EU 168/2013 (EC, 2013) and involve the feasibility of particle number measurements (Giechaskiel et al., 2015) and off-cycle emissions, i.e., non-type-approval driving cycles run on a chassis dynamometer. The baseline concept promoted by the European Commission is that an L-

category vehicle should be clean and energy efficient in each point of its possible operation range, in addition to the typeapproval driving cycle (Zardini et al., 2016b).

Before the introduction of Euro 5 for the L-category, the European Commission undertook an environmental effect study (Zardini et al., 2016b; EC, 2017b) which included a preliminary assessment of RDE. The effect study concluded that the

- 5 concentrations of pollutants can be measured with a marketable, small, portable system exhibiting an average discrepancy of about 10% during chassis dynamometer tests, except for hydrocarbons affected by more than 50% discrepancy. The disagreement in hydrocarbons measurements stems from different applied techniques: flame ionization detector with the use of a hydrogen cylinder in the test-cell; non-dispersive infrared in the PEMS (in order to exclude safety issues related to the transportation of a hydrogen cylinder on a 2-wheeler). Mass emissions during lab tests and RDE on-road tests compared to
- 10 lab tests were instead vehicle and compound dependent, and affected by larger uncertainty and discrepancy due to the additional estimate of the exhaust flow. Exhaust mass flow meters mounted on passenger cars are still too heavy and energy consuming to be deployed on 2-wheelers during RDE tests (see EC, 2017b, for further details) and exhaust pulsations might be an issue for them.

PEMS use analyzers to continuously measure the concentrations of the pollutants of interest, and methods to measure or estimate the instantaneous flow of exhaust. The data are then synchronized and concentrations multiplied by the corresponding exhaust flow to obtain instantaneous mass emissions of the measured pollutants. Early PEMS relied on simple automotive exhaust analyzers such as those used in the California Air Resources Board periodic inspection programs, with the exhaust flow neglected (Kelly and Groblicki, 1993), inferred from engine operating data (Vojtisek-Lom, 1997), or measured by a Pitot tube (Breton, 2000), or similar device.

- 20 With few exceptions (e.g., Lenaers, 2003), the majority of PEMS use standard non-dispersive infra-red (NDIR) analyzers to monitor carbon monoxide (CO) and dioxide (CO₂), chemiluminescence or non-dispersive ultra-violet spectroscopy for nitrogen monoxide (NO) and dioxide (NO₂), and flame ionization detection (FID) for hydrocarbons (HC). Some early PEMS (Vojtisek-Lom and Cobb, 1997; Breton, 2000) were based on analytical components from garage-grade analyzers (HC, CO and CO₂ measured with NDIR, NO and O₂ with electrochemical cells). Despite the considerable miniaturization and
- 25 improvements in recent PEMS technology, only a couple of PEMS models are at present marketable featuring technical specifications suitable for the L-category: light weight, small size, simultaneous measurements of multi-gas concentrations, engine parameters and geo-localization. The systems designed for passenger cars and heavy duty vehicles weigh tens of kg (about 100 kg including exhaust flow meter and batteries, thus disproportionally increasing emissions when on-board of an L-category vehicle) and are excessively bulky for safe installation on a 2-wheeler.
- 30 To our knowledge, the peer-reviewed scientific literature about tailpipe emissions from L-category vehicles relies entirely on laboratory measurements using chassis dynamometers. In some cases, the speed profile was recorded during real-world driving and used for subsequent emissions measurement in a laboratory (Zamboni et al., 2011; Murena et al., 2019). The goal of this study was to demonstrate a miniature PEMS device (Mini-PEMS, hereafter) suitable to be fitted on

motorcycles, scooters and mopeds, compare it against standard laboratory instrumentation during roller bench tests, and to

assess its performance during on-road tests of three 2-wheelers, 1 moped and 2 motorcycles. The validation was conducted with the intended use of the Mini-PEMS as a tool for research and development, road worthiness (periodical inspections) and screening tool for the market surveillance (e.g. Regulation EU 2017/1151).

2. Experimental

5 Tailpipe exhaust emissions from 3 L-category vehicles (1 moped, 2 motorcycles) were characterized during i) legislative driving cycles on a roller bench in the Vehicle Emissions Laboratory of the European Commission – Joint Research Centre (JRC) and ii) real-driving tests with a miniature on-board measurement system (Mini-PEMS, Technical University of Liberec, Czech Republic). A schematic summary of the deployed techniques in the test cell and in the Mini-PEMS is presented in Table S1. Overall, 8 laboratory emission tests and 9 on-road trips were performed.

10 2.1 Test cell

The test facility has already been described in Zardini et al. (2014, and references therein). Here briefly, the vehicles were driven on a 48'' roller bench (Zoellner GmbH) and their raw and diluted exhaust analyzed in accordance with Regulation EU 134/2014 (EC, 2014); see schematic in Figure 1. Total hydrocarbons (THC), carbon monoxide (CO) and nitrogen oxides (NO_x) are regulated by the EU legislation on 2-wheelers aiming at reducing air pollution. Carbon dioxide (CO₂) is instead

- 15 reported for energy efficiency assessment and global warming related issues, but not yet regulated for this class of vehicles. We monitored the raw exhaust at 1 Hz via a 190 °C heated line with the following techniques (integrated in the AMA i60 Exhaust Measurement System, AVL): flame ionization detector for THC, chemiluminescence detector for NOx, nondispersive infrared for CO and CO₂. The same on-line techniques were deployed at the constant volume sampler (CVS) after dilution of the exhaust through a Venturi nozzle dilution tunnel (CVS flow $\approx 5 \text{ m}^3/\text{min}$; average dilution ≈ 25). Finally, a
- 20 constant volume sample taken from the CVS flow was collected in tedlar bags and analyzed off-line after the test. The results of the bag analysis yield the legislative emission factors (EFs) given in mass/distance unit. Following a well-established methodology, bag values were corrected for exhaust extracted from the tailpipe due to raw exhaust sampling by multiple devices. For instance, the range of mass extracted/total mass of CO₂ is between 9% for Vehicle 2 and 21% for the moped. In particular, the laboratory setup can provide three sets of EFs obtained from: (i) the raw exhaust concentrations and
- 25 flow rate, (ii) the diluted exhaust concentrations and constant flow rate and (ii) the off-line analysis of bag sampling as prescribed by the EU legislation. In the laboratory, two methods are typically applied for the determination of the exhaust flow: (i) the difference between the CVS constant flow and the dilution air flow and (ii) the well-established CO_2 tracer method based on raw (tailpipe) and diluted (CVS) CO_2 simultaneous measurements (Wiers et al. 1972). Due to the low exhaust flow rate of 2-wheelers, the difference between two flows of similar magnitude (CVS and dilution air) measured by
- 30 different flowmeters results in large uncertainty. Therefore, the CO₂ tracer is the method of choice in the present work.
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The AVL Particle Counter (APC) 489 (AVL, Graz, Austria), compliant with the light-duty vehicle regulations, was connected to the dilution tunnel to measure non-volatile particles to measure particles >23 nm and >10 nm (Giechaskiel et al., 2009; Giechaskiel et al., 2010). Particulate matter mass was measured on Teflon coated glass fiber; Pallflex TX40 HI20WW filters according to the regulation (available only for the cold start cycles)..

5 2.2 Vehicles and driving cycles

The technical specifications of the vehicles under investigation are given in Table 1. We have chosen 3 popular in-use 2-wheelers type-approved and sold in the European market based on the stocktaking and market sales analysis in Clairotte et al. (2016): 1 moped and 2 medium performance motorcycles, as per EU terminology (EC, 2013). The EU legislation sets the emission limit values for the gaseous pollutants THC, NO_x and CO depending on the Euro standard of homologation and the vehicle L-subcategory, as summarized in Table S2. Note that the provisions for the durability of after-treatment devices, i.e. compliance with limit values within a prescribed mileage, were not enforced for Euro 2 and Euro 3 L-category vehicles. Therefore it could be possible not to comply with emission limits at the time of testing. The 2-wheelers were fuelled with E5 reference petrol containing ≈ 5% vol/vol of ethanol (see EC, 2014, for reference fuel specifications) and their fuel consumption measured with a fuel consumption measurement system (KMA, AVL). Figure S1 and Table 2 describe the two

- 15 driving cycles for tailpipe emission monitoring: the United Nations ECE-R47 (UNECE, 1981) driving cycle run by the moped and the Worldwide-harmonized Motorcycle Test Cycle (WMTC) for motorcycles (EC, 2014). The ECE-R47 test cycle consists of eight elementary, consecutive cycles and lasts 896 s in total. Only during Phase 2, also called hot phase (the latter 4 elementary cycles), the exhaust gas should be sampled to produce the EFs described above for type-approval purposes of Euro 2 mopeds (as of July 2014, the type-approval of vehicles requires the sampling of the entire cycle - Euro 3
- 20 test procedure for mopeds). However, we sampled and reported both cold and hot phases of the ECE-R47 cycle in order to maximize the range of application of the Mini-PEMS and to report more realistic EFs. The WMTC cycle is mandatory from the introduction of the Euro 4 step for motorcycles, while it was an alternative option for type-approval of Euro 3 motorcycles as those in our study. The prescribed WMTC for a specific vehicle is assigned depending on engine displacement and vehicle maximum speed out of a set of 5 different driving cycle types (EC, 2014): Vehicles 2 and 3
- 25 performed the WMTC type 2-2 and type 2-1, respectively (see Figure S1). The moped was additionally emission-tested over a wide-open throttle cycle consisting of running the vehicles at constant roller speeds with the throttle plate fully open in order to increase the dynamic range of Mini-PEMS measurements.

The real-driving tests were performed for each vehicle by repeating 3 times a 2.24 km nearly flat-land loop (average altitude ≈ 200 m above sea level; altitude range ≈ 10 m) mimicking urban/suburban driving with cold or hot engine start; see details

30 in Table 2 and Figure S2. The loops were chosen purely for the Mini-PEMS validation and were neither designed to be comparable to legislative driving cycles on the roller bench, nor to fulfil PEMS legislation requirements in EU, which at present are specific only to passenger cars and heavy duty vehicles.

2.3 Mini-PEMS

The on-road tests were conducted with a miniature portable on-board emissions monitoring system (Mini-PEMS), according to a general concept developed by Vojtisek-Lom et al. (1997; 2009), where instantaneous emissions are determined as a product of the measured concentrations of the pollutants of interest and the estimated mass flow rate of the exhaust. The

- 5 parameters of the system are given in Table 3, and a schematic in Figure 2. The system samples undiluted raw exhaust at nominally 8 litres per minute. The sample is cooled down by natural convection in the sample line, passed through a condensation bowl from which the condensate is continuously removed by a pump, and reheated in a copper tube immersed in a bath of transformer oil heated by resistance heating to approximately 60 °C. The sample is then divided into two paths. In one path, the sample is filtered, passed through a non-dispersive infra-red (NDIR) analyzer to measure the concentrations
- 10 of HC, CO and CO₂, and subsequently divided into three electrochemical cells measuring the concentration of oxygen, nitrogen monoxide (NO) and nitrogen dioxide (NO₂). In the second path the sample runs through a semi-condensing integrating nephelometer (635 nm, 45° forward scattering) tuned to provide reading proportional to particle mass concentrations, and subsequently through a heated ionization chamber (²⁴¹Am, 30 kBq), where the particles present in the chamber deplete the ions, decreasing the current between two electrodes on which a small voltage differential is applied. The
- 15 change in ionization current has been shown to correlate to the total particle length (independently of the particle size), with a useful measurement range starting at levels corresponding to particle number concentrations of approximately $5 \cdot 10^5$ particles/cm³ (Vojtisek-Lom, 2011). These methods, although not measuring directly mass or number, can be correlated well to the current methods, i.e. gravimetry of filters and condensation particle counters, respectively (Giechaskiel et al. 2014). The engine speed was measured by an optical sensor pointed to a reflective tape placed on the engine cooling fan mounted
- 20 on the crankshaft. Alternatively, the setup can determine the engine speed by sensing signals from spark plug or injector wiring, or using vibration sensors. Access to the intake manifold was obtained either from the existing vacuum system, or, in its absence, by drilling a small hole into the intake manifold downstream of the throttle plate; see Picture S1.

Vehicle speed and position were measured by a Global Positioning System (GPS) receiver. All data were acquired by a builtin industrial computer. The system has a footprint of 45 x 31 cm, a height of 18 cm, and mass of 13 kg, and operates on 9-14

- V with a consumption of approximately 50 W. The total mass of the system, including power electronics, sensors, cables and sample lines, was 17.7 kg. The setup was mounted on the luggage rack of the 2-wheelers and powered by an external battery (12V, 20Ah LiFeYPo, 3.4 kg, allowing 3-4 hours of autonomy) attached to the platform for the rider's feet. The installation of the system is shown in Picture S1, with details of engine speed sensor, intake manifold pressure sampling point, and exhaust sampling given in Picture S2.
- 30 A second Mini-PEMS system (Mini-PEMS No. 2) based on the same measurement techniques explained above, and using the same key components (except for the light scattering sensor which was omitted), but smaller and lighter than Mini-PEMS No. 1, was deployed in parallel during the 3 roller bench tests of Vehicle 2; see Picture S3. It featured a built-in
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battery allowing 3-4 hours of autonomous run time, a footprint of 40x20 cm, height of 20 cm, and total mass of less than 10 kg.

The fuel consumption measured by the KMA flow meter was compared to the fuel consumption inferred from the emissions measured by the Mini-PEMS and by the laboratory. In both cases, the mass emissions of carbon were calculated from THC,

5 CO and CO₂ emissions and then divided by the 86.6% carbon content of the fuel to obtain fuel mass flow rate (MFR):

MFR
$$[g.s^{-1}] = (M_C/M_{CO} * CO [g.s^{-1}] + M_C/M_{CO2} * CO_2 [g.s^{-1}] + M_C/M_{HC} * HC [g.s^{-1}]) / 0.866$$
 (1)

where M_x is the molar mass of carbon (C), CO, CO₂ and HC, $x [g.s^{-1}]$ is the mass flow of compound x, 0.866 represents the mass fraction of carbon in the fuel. A molar weight of HC = 14 g/mol was calculated from fuel properties. Emissions over a test run are obtained by integrating the instantaneous emissions, and dividing the total emissions (in grams per test) by the

10 total distance driven to obtain emission factors in g/km. Note that the EU legislation prescribes fuel consumption calculations based on integrated off-line bag results, partly to avoid the uncertainty caused by synchronization and dynamic correction of instantaneous data.

The exhaust flow rate is inferred from the intake air flow, which is estimated using the speed-density method from measured engine speed and intake manifold pressure and temperature, engine displacement and known or assumed engine volumetric

15 efficiency (Vojtisek-Lom, 1997; Vojtisek-Lom and Cobb, 1998). The original formula assumed general volumetric efficiency (0.9-0.95 at higher loads) of automotive engines, which is excessively high for small engines. Empirical adjustments were therefore introduced based on laboratory tests to account for considerable lower volumetric efficiencies for small motorcycle engines, especially in the lower end of their rpm range. The intake flow rate can therefore be obtained from:

20
$$m_{air} [g.s^{-1}] = 0.0289 [kg.mol^{-1}] * n_{vol} * V [dm^3] * rpm [min^{-1}] * (MAP [kPa] - p_{bar} [kPa] / CR) / T_{int} [K]$$
 (2)

where m_{air} is the intake mass flow rate, 0.0289 is the molar weight of ambient air in the standard atmosphere, V is the engine displacement, η_{vol} is the engine volumetric efficiency, *rpm* is the engine rotational speed, *MAP* is the manifold absolute pressure, p_{bar} is the barometric pressure, *CR* is the dimensionless engine compression ratio, T_{int} is the intake air temperature. Two scenarios were considered:

- 25 a) constant volumetric efficiency of $\eta_{vol-const} = 0.5$ for all combinations of engine speed and load; this approach is believed to provide a reasonable estimate for naturally aspirated engines without EGR (see Section 3)
 - b) engine speed- and load-dependent volumetric efficiency $\eta_{vol-var}$ calculated using the empirical formula derived by comparing instantaneous fuel consumption obtained by direct measurement and calculated from Mini-PEMS data:

$$\eta_{vol-var} = [(\eta_{vol-const} + (1/CR)]^* \{1 - [p_{bar}/(CR^*MAP)]\} + [(rpm-5000)/3200] - 0.0015^* \{p_{bar}^* [1-(1/CR)] - MAP\}$$
(3)

where CR is the dimensionless engine compression ratio and p_{bar} is the barometric pressure in kPa.

In both scenarios, the empirical values were obtained iteratively by comparing instantaneous mass fuel flow rate calculated by the Mini-PEMS with the instantaneous fuel consumption measured by the laboratory (results not reported here).

While exhaust flow can be inferred from known exhaust and fuel composition and from either fuel or intake air flow
5 (Vojtisek-Lom and Cobb, 1997), for simplicity, the intake flow as described above was used in lieu of the exhaust flow in Mini-PEMS fuel flow and exhaust calculations. Additionally, the volumetric efficiency included a variable dry-to-wet correction (Giechaskiel et al. 2019a) applied to measured CO₂ and CO.

The emission factors from PEMS measurements where finally calculated as follows:

10 $X [g.s^{-1}] = m_{air} [mol.s^{-1}] * [X] * M_x [g/mol^{-1}]$ (4)

where m_{air} is the molar flow of the intake air, [X] is the volume fraction of the X compound in the undiluted exhaust, and M_x is the molar weight of the X compound.

The validation of the Mini-PEMS against laboratory instrumentation over roller bench tests performed in accordance with

- 15 Regulation 134/2014 (EC, 2014) was based on the comparison of (i) the pollutant concentration profiles from the raw exhaust, (ii) the exhaust flow rates and (iii) the emission factors. Ultimately, EFs obtained on-road with the Mini-PEMS should be compared with (i) laboratory EFs originated from the legislative method to assess the severity of the test cycle with respect to real-driving, and/or with (ii) emission limit values prescribed by the legislation in order to validate the environmental performance of the vehicle, as prescribed in the recent Euro 6 legislation dealing with in-service conformity
- 20 of passenger cars (EC, 2018; Varella et al., 2018). As expected from basic principles governing the combustion of small gasoline engines, NO₂ emissions were negligible (up to 1% of NO) and therefore not reported.

3 Results and discussion

3.1 Mini-PEMS versus laboratory

3.1.1 Pollutant concentrations

- 25 Table 4 compares gaseous average concentrations of THC, CO, NOx and CO₂ obtained with laboratory instrumentation (bench) against those from the two Mini-PEMS during 8 roller bench tests according to the methods described in section 2. Single test percentage deviations, mean absolute percentage deviations (MAPD) for each vehicle and overall for the fleet as well as maximum and minimum deviations are included. Considering Mini-PEMS No. 1, the overall MAPD was 2% for CO₂, 8% for HC and CO, and 13% for NOx, indicating very good agreement with laboratory instruments. The best
- 30 agreement was obtained for CO_2 , which typically exhibits the largest and most stable concentration profile during emission
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testing from internal combustion engines. The worst single-test deviation was for NOx in Test 1 (24%) due to substantial zero drift of the Mini-PEMS sensor.

An example of raw exhaust concentration profiles during Test 5 and associated 1-to-1 plots with linear regression coefficients are plotted in Figures S3 and S4, respectively. The two Mini-PEMS well followed the dynamic emission pattern

- 5 down to a few seconds resolution. The largest discrepancies were related to the signal peaks where the longer or different response time of the Mini-PEMS results in peak magnitude underestimation and subtle shifts in instantaneous values during transients, which negatively affects the coefficients of determination (\mathbb{R}^2) in Figure S4.
- Table S3 summarizes the comparison between the two Mini-PEMS and the bench in terms of coefficients of determination.
 The results vary substantially among the tests. Differences in instantaneous readings during transients and peaks due to
 limited 1 Hz resolution and different time response constants of the respective instruments, possible dilution of the exhaust sample at idle due to comparable amounts of available exhaust and sampling lines (about 20 lpm for the moped), and in case of HC, deposition of semi-volatile hydrocarbons (known as hydrocarbon hangup) in the Mini-PEMS sampling train, were identified as the main responsible to lower values of coefficients of determination.
- In order to assess the performance of the two Mini-PEMS during the cold phase of the test cycles when the temperature of the sampled exhaust increases from about 25 °C up to 200-300 °C in about 3 minutes, the approach above was repeated for separate cold and hot cycle phases as shown in Table S4. Looking at cold start Tests 1, 5, 6, and 8, the sampling of the cold phase did not represent a critical issue for the two Mini-PEMS as the performance is comparable or better than in the hot phase. However, the phase split highlights a large discrepancy between laboratory and Mini-PEMS No. 1 in Test 8. The average HC concentrations measured by Mini-PEMS No. 1 during Test 8 were, compared to the laboratory, lower during the
- 20 first phase of the test, and higher during the second phase. This demonstrates a shortcoming of the unheated sampling and measurement system used in the portable system, in which semivolatile organic species (i.e., fuel and oil vapors) present in high concentrations during a cold start partially condense within the system, causing the readings to be initially lower, and later are re-entrained into the sampling stream, causing readings to be higher. This phenomenon occurs initially in the exhaust system, but it is partially dampened by the heated gas line of the FID used as a reference. Concerning Mini-PEMS
- No. 2, the mean concentrations reported in Table 4 show excellent CO_2 correlation with the laboratory (MAPD < 1%) and very good agreement in terms of CO and NOx (MAPD = 7% and 13%, respectively). This good performance, along with similar results from Mini-PEMS No. 1, confirmed the reliability of the setup design when measuring pollutants concentration in vehicular exhaust. The larger deviation for HC (MAPD = 20%, with largest single test deviation of 32%) can be explained with the condensation of semivolatile compounds in the sampling system (hydrocarbon hang-up) and different sensitivity of
- 30 the NDIR sensors used in the 2 Mini-PEMS to individual hydrocarbons.

3.1.2 Exhaust flow rates

The determination of the exhaust flow is the second key parameter involved in the calculation of mass/distance emission factors and fuel consumption from instantaneous data, beyond the chemical concentration discussed above. The legislative emission factors calculations do not rely on the exhaust flow, while those from Mini-PEMS do (see Chapter 2). The

- 5 laboratory exhaust flow calculated with the CO₂ tracer method should not be considered as a legislative reference against which to validate the two Mini-PEMS, but as the state of the art estimate available. The upper panel of Figure 3 shows the comparison between the exhaust flows calculated from laboratory instrumentation and from the two Mini-PEMS for Test 5. The agreement is qualitatively good considering that the two approaches were completely different (see section 2 for details). The largest deviations occurred during idle (very low flow rate \approx 30 L/min) and during quick deceleration phases when the
- 10 abrupt change in CO_2 concentrations causes narrow peaks in the tracer method curve. On average for all tests, the coefficients of determination between the 2 methods are fairly good ($R^2 \approx 0.7$) as reported in Table S3, confirming that (i) the Mini-PEMS applies an approach which gives similar results to the CO_2 tracer method commonly used when sampling directly from the tailpipe and that (ii) the exhaust flow remains the critical parameter to assess when performing raw exhaust measurements. The validation of the CO_2 tracer method is discussed below in terms of emission factors. Note that at the
- 15 moment there are no exhaust flow meters to be deployed on 2-wheelers on-road. Future technical developments may fulfil this gap; however, exhaust flows from 2-wheelers are intrinsically difficult to measure precisely due to small flow rates (especially at low engine loads) and, in the presence of one cylinder, to flow pulsations.

3.1.3 Fuel consumption

Fuel efficiency of vehicles is officially reported in EU type-approval certificates and calculated from integrated emissions over the entire legislative emission tests (test type VII, EC, 2014). Neither instantaneous fuel consumption during roller bench tests nor real-driving fuel consumption (both calculated from instantaneous emissions, see section 2.3) are required. Nevertheless, great attention was recently paid over real driving fuel consumption data (see e.g., Fontaras et al., 2017, and references therein) especially when results differ from the official values reported by manufacturers.

- The fuel consumption calculated with the carbon balance method from the Mini-PEMS and laboratory HC, CO and CO_2 emissions is compared with the fuel consumption measured by the fuel flow meter (reference) in Figure 3. The agreement was good except for the underestimated relative maxima of laboratory results compared to the fuel flow meter. Table 5 compares fuel consumption results from 3 tests for (i) the fuel flow meter, both in mass and volume of fuel (with instantaneous control of fuel density and temperature), (ii) the laboratory instrumentation (legislative results from bag analysis of diluted emissions and integrated instantaneous results from raw emissions), (iii) the two Mini-PEMS. In all cases
- 30 the deviation from the reference was \leq 10%, with an excellent performance of the two Mini-PEMS (deviation < 5%). This indicates that:

- The legislative method based on carbon balance and diluted emissions is a good approximation to determine fuel consumption during roller bench tests. Note that the relatively high difference is probably due to the extracted flow from the tailpipe that increases the uncertainty;
- The same method applied to raw exhaust sampling is in good agreement with the reference;
- The Mini-PEMS is a valuable instrument to assess the fuel consumption and can provide useful insights during realdriving tests. Error attributed to using assumed rather than actual volumetric efficiency contributes substantially to the differences between PEMS and laboratory data and can be reduced by experimental determination of the engine volumetric efficiency in the laboratory from emissions or fuel consumption data.

3.1.4 Mass emissions

- 10 As an example, mass flow rates of HC, CO, NO_x and CO_2 , during Test 5 from the two Mini-PEMS are compared against the laboratory instrumentation in Figure 4 assuming variable (engine speed and load dependent) volumetric efficiency (see section 2.3). The agreement is qualitatively very good considering that mass flows are affected by combined uncertainties on the chemical concentration and on the exhaust flows previously discussed. Clearly, the Mini-PEMS could be used to monitor dynamic exhaust mass flows and for instance to spot tampered vehicles (see Zardini et al, 2016a) or to investigate on-road
- 15 after-treatment strategies for pollution reduction. Table 6 summarizes the emission factors for laboratory tests performed on the legislative test cycles ECE-R47 and WMTC assuming variable volumetric efficiency. WOT Tests 3 and 4 were excluded from the analysis to avoid reporting artificially high EFs. Similarly to the assessment of concentration profiles, EFs were in very good agreement: the overall MAPD for Mini-PEMS No. 1 was below 10% for all compounds and down to 5% for CO₂. The worst single-test deviation was -22% for NO_x in Test 2. Mini-PEMS No. 2 exhibited a generally lower performance in
- 20 terms of deviations due to lower sample flow during the tests and to the smaller specific data set. Nevertheless, a MAPD < 20% for all compounds indicated good agreement between instruments. The estimated measurement uncertainty for the laboratory measurement (bag data) of NO_x is 10% at 80 mg/km and 5% at the 150 mg/km, of HC is 10% at 50 mg/km and 5% at 200 mg/km, and of CO and CO₂ is 3% for all emission levels. This
- uncertainty is shown in Figure 6 as a separate arrow rather than being added to each point. The largest components of 25 uncertainty for the Mini-PEMS are the engine volumetric efficiency (affecting the exhaust flow calculations), the uncertainty of HC and PM measurements due to the limitations of the approach chosen (unheated sampling train, surrogate measurements for PM), and the uncertainty associated with dynamic events (rapid changes in both exhaust flow and pollutant concentrations). These non-controllable uncertainties were estimated ex post to be overall in the range from 10% up to 20% (see MAPD, mean absolute percentage differences, in Table 4 and Table 6). The known uncertainty of gaseous
- 30 component measurements at steady-state, above the detection limit, is 3-5%, and the combined uncertainty of engine rpm and intake manifold pressure and temperature is 1-2%. We estimated this known uncertainty to be about 5% for all

measurements. These known uncertainties are shown as error bars in Fig. 7 for Mini-PEMS no. 1, variable volumetric efficiency data.

The EFs of HC, CO, NO_x and CO_2 for each cycle as calculated by the two Mini-PEMS and as measured by the laboratory are compared in Figure 5 for a total of 6 tests. Three sets of EFs from Mini-PEMS were compared against the laboratory: EFs

- 5 from Mini-PEMS No. 1 were obtained using both variable (speed- and load-dependent) and constant engine volumetric efficiency. For Mini-PEMS No. 2 the comparison is plotted only for variable volumetric efficiency in order to retain clarity. Individual data points represent the emissions factors for each test, with laboratory and Mini-PEMS data on the horizontal and vertical axes, respectively. Linear regression is shown for Mini-PEMS No. 1 variable volumetric efficiency. It is apparent that except for HC, there is little discrepancy between EFs calculated by Mini-PEMS No. 1 and No. 2. The
- calculations using constant volumetric efficiency in Table S5 show a higher, but still relatively small (overall average < 10%), deviation from the laboratory data.
 In our analysis, the EFs from the legislative method were chosen as a reference against which the Mini-PEMS was compared

in line with current real driving emission legislation and in order to assess the performance of the instrument in typical cases when only the diluted exhaust sampling is present in the laboratory (e.g., type-approval). For sake of completeness, mass emissions were also calculated from the raw exhaust with laboratory instrumentation and further comparison between EFs

- from Mini-PEMS, EFs from bag sampling and EFs from the raw exhaust sampled with bench instrumentation was carried out. Figure S5 displays the EFs with the three methods broken down by driving cycle phase. The bag and raw exhaust methods with laboratory instrumentation were in good agreement (NOx MAPD = 16%; THC MAPD = 13%, averaged on the cold and hot cycle phases of all vehicles) or very good agreement (MAPD = 8% for CO and 4% for CO₂), in line with the
- 20 historical records of the JRC laboratory. The Mini-PEMS performed well against the raw exhaust method, slightly worse than against the legislative method discussed above due to the propagation of uncertainties in the exhaust flow. NOx MAPD per phase, shown in Tables S6 and S7 for variable and fixed volumetric efficiency, remained unchanged, but averaged MAPD for HC, CO and CO₂ increased up to 20%, 15%, and 10%, respectively.
- In order to contextualize our work in the current EU real-driving legislative framework laid down in Regulation EU 2017/1151 (EC, 2017a) and Regulation EU 2018/1832 (EC, 2018) applicable to passenger cars, the Mini-PEMS derived EFs were compared to the legislative EFs in Figure 6. For each pollutant apart from THC (not included in the EU RDE legislation), two graphs are plotted: for each phase of the test separately on the left, and for the whole test on the right. The compound specific tolerances introduced by Regulation EU 1151/2017 (EC, 2017a) to account for the additional measurement uncertainty of PEMS relative to standard laboratory equipment are plotted as dashed red lines. It is apparent
- 30 from Figure 6 that in most cases, the differences between the PEMS and the laboratory fall within the margins of uncertainty applicable to type-approval grade PEMS, and outer values are relatively close to the margins. The tests outside the margins are mostly of Vehicle 1 (50 cc engine), confirming the experimental challenge posed by measuring emissions from small vehicles.

Even though the mini PEMS does not always comply with the light-duty vehicles PEMS tolerances, it should be noted that the deviations are still at acceptable levels and the Mini-PEMS is considerably smaller and simpler than the type-approval grade PEMS. The mass of the regulatory PEMS would affect the performance and the emissions of small motorcycles, which are type-approved with driver weight of 75 kg. It should also be noted that pulsations in the exhaust flow of small single-

5 cylinder engines pose a considerable challenge to the direct exhaust flow measurement prescribed for type-approval RDE tests of automobiles and heavy vehicles.

The particulate matter measured with the mini-PEMS was compared with the number of non-volatile particles from the tailpipe and the dilution tunnel (Giechaskiel et al. 2019b), as applicable to recent diesel and direct injection passenger cars

- 10 and heavy duty vehicles (Giechaskiel et al. 2018). Note that the mini-PEMS measures particles by light scattering and by an ionization chamber in a sample of raw exhaust, without removal of the semi-volatile compounds. Light scattering is typically sensitive only to particles with a diameter over 100 nm, with the response being dominated by larger particles; on the ionization chamber, there is no lower limit on the particle size. While there is no upper limit for the particle diameter detected, as few particles are larger than 1 µm, particles larger than several µm are likely to be trapped in the condensation
- 15 bowl. In Table S8, the non-volatile particles sampled at the dilution tunnel and at the tailpipe are compared to the total number (including volatiles) inferred from ionization chamber measurements and particulate mass emissions inferred from laser scattering (based on calculated exhaust flow and concentrations measured in the raw exhaust). For the two R47 tests listed in Table S8, the comparison of second-by-second particle number emissions (particles per second) is plotted in Figure S6.
- 20 The total particle number emissions measured by the Mini-PEMS is in the range from similar up to double relative to nonvolatile particle number emissions > 10 nm (Giechaskiel et al. 2015). The specific vehicle had emissions on the same order of magnitude as the limit value ($6 \cdot 10^{11}$ particles/km) applicable to recent passenger cars.
- Table S9 gives non-volatile particle number and particulate mass for cold start cycles as measured in the laboratory and as measured by the mini-PEMS. It should be highlighted that the tests were conducted on different days, thus they include the
- 25 repeatability variability. The mini-PEMS particle number is between the 23 nm and 10 nm emissions, and lower than the total particle number. The estimated mass is also lower than the mass determined gravimetrically with the filter method. This is partly expected because the filter method can also be influenced by artefacts due to the presence of volatile species (Chase et al. 2004).

3.1.5 Mini-PEMS No. 1 vs Mini-PEMS No. 2

30 The accuracy of the instantaneous mass emissions rates is dependent on the quality of the concentration data, exhaust flow data, and synchronization between the two data streams (Giechaskiel et al. 2018b; Vojtisek-Lom et al. 2018). The principal uncertainty associated with the exhaust flow data is the estimation of the engine volumetric efficiency. The uncertainty

associated with the measurement of engine speed and intake air pressure and temperature is rather small, the sensor response relatively fast, and uncertainty of the sensor outputs relatively small. The uncertainties associated with the concentration data are comparable between the two PEMS instruments, as they use the same detection principles and similar components. The synchronization of the data is comparable between the instruments. The difference between the two Mini-PEMS, as apparent

- 5 from Table 4, Table 6, Figure 3 and Figure 4, is therefore closer to the unit-to-unit variance than to a difference between two different technologies. Both the concentration and the mass emissions data presented here suggest that the difference between the two Mini-PEMS units is relatively small (up to 0.04 g/km HC, 0.01-0.07 g/km CO, < 0.01 g/km NO_x) and slightly smaller or comparable to the differences between Mini-PEMS and laboratory (up to 0.03 g/km HC, 0.06-0.17 g/km CO, < 0.02 g/km NO_x), suggesting that systematic errors (such as bias caused by using NDIR technology for HC detection,
- 10 or by estimating engine volumetric efficiency) represent a substantial part of the overall uncertainty of the Mini-PEMS measurement.

3.2 Real-driving emissions

The PEMS emission factors during on-road trips are typically compared to those obtained in the test cell in order to identify discrepancies between real driving and laboratory emissions (e.g., during in-service conformity checks). We applied the same procedure with few notes of caution. Two-wheelers have so far very limited on-board diagnostics: the introduction of emission monitoring OBD is planned in 2020. The presence of a defeat device to reduce the emissions during type-approval test cycles can be therefore excluded a-priori, i.e., large discrepancies between roller bench and on-road tests due to artificial modification of the engine map were not expected. Secondly, the real-driving emission test is not included in the current

legislation for 2-wheelers and there are no comprehensive studies from which to derive the technical definition of an agreed

- 20 typical on-road trip for 2-wheelers with associated boundary conditions and tolerances. Agreement between contracting parties was reached during the definition of the legislative laboratory WMTC of subcategory L3e-A3 (high performance motorcycles) which was then applied and adapted to the other members of the L-category family (EMISIA, 2013). Finally, mopeds (subcategory L1e-B) are subject to legislative limitation of maximum speed (typically 45 km/h, 25 km/h in some EU countries) which corresponds to their maximum WMTC speed: their laboratory emission testing covers the entire speed
- 25 range. Our on-road trips are neither based on the average driving, nor contain a prescribed mix of low/middle/high speed, nor respect validity criteria; they are simple tools to demonstrate the capabilities of the Mini-PEMS. Vehicle speed and positive acceleration of on-road trips as a function of the actual distance relative to the start were given in Figure S2. Exhaust concentration and real driving emission factors during on-road trips of the three vehicles are reported in Table 7. By
- comparing on-road against laboratory data in Table 4 and Table 6, it is apparent that the mean concentrations of HC for 30 Vehicle 1 on the road (3603-4037 ppm) are comparable to the WOT test (2089-3722 ppm) and higher than the R47 test (1455-1550 ppm) in the laboratory. Similarly, the concentration of HC was doubled during the on-road cold start test (2089 ppm) than in the laboratory cold start WMTC (1197 ppm) for Vehicle 3. The concentrations of CO on the road were lower
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for Vehicle 1 (0.5-0,9%) than in the laboratory (0.8-1.4%) and higher for the other two vehicles. Concentrations of NOx were, for all three vehicles, higher on the road (238-382 ppm) than in the laboratory (129-276 ppm). This is in agreement with positive acceleration data of Table 2: Our on-road trips resulted more severe than the WMTC and less severe than the R47 legislative cycles due to a combination of trip composition and driving behaviour.

- 5 The on-road emission factors calculated with the Mini-PEMS assuming variable volumetric efficiency relative to the laboratory were higher for HC from Vehicle 1 (0.29-0.43 g/km on the road, 0.19-0.20 g/km laboratory) likely due to lower ambient temperature and comparable for the other two vehicles. CO emissions in the laboratory were higher from Vehicle 1 due to prolonged wide open throttle operations and lower for the other two vehicles which instead could easily follow the WMTC speed trace. NO_x emissions in the lab and on the road were comparable for Vehicle 1 and 3, but larger on the road
- for Vehicle 2 (0.11-0.14 g/km laboratory, 0.23-0.35 g/km on the road). The emissions of CO₂ on the road were lower (48-51 g/km Vehicle 1, 39-45 g/km Vehicle 3) or comparable (72-79 g/km Vehicle 2) to the laboratory tests (55-66 g/km Vehicles 1 and 3, 75-82 g/km Vehicle 2. The particle mass emissions on the road (0.35-0.44 g/km) were comparable to slightly higher than in the laboratory (0.18-0.40 g/km as measured by Mini-PEMS), while particle number emissions (including volatiles) on the road (3.4-4.4 x 10¹¹ particles/km) were comparable to slightly lower relative to the 5.5 x 10¹¹ 1.5 x 10¹² particles/km
 measured by the Mini-PEMS in the laboratory (Table S8).
- As an example, the instantaneous emission rates of HC, CO and NO_x are given in Figure 7 for Vehicle 2. The sharp accelerations after a stop are clearly visible in terms of HC and CO emissions: while HC large emissions decrease after few seconds of acceleration, the CO emissions remain high during wide-open throttle operations, indicating that this mode of driving (potentially frequent on small motorcycles) dominates the amount of CO emissions.
- 20 A comparison of emissions between laboratory and on-road trips both calculated with the Mini-PEMS is plotted in Figure 7. Summary of real driving and laboratory emission factors. Roller bench emissions were obtained with laboratory instrumentation (green circles) and the Mini-PEMS (green squares). Grey bars are average real driving emission factors obtained with the Mini-PEMS from on-road cold start (blue squares) and hot start tests (orange squares). Error bars appear only on the first column in order to preserve readability.7; laboratory results are averaged on cold and hot start tests for
- 25 readability, detailed results can be found in Table 6. Pollutants real driving emissions are generally larger than during legislative tests with HC and CO deviations enhanced during on-road cold start tests and larger NO_x deviations during hot start tests. One exception is the large CO emission factor of Vehicle 1 in the laboratory for the reasons explained above. The behaviour of CO_2 emissions, in the opposite direction with larger values related to laboratory tests for Vehicle 1 and 3, indicated better after-treatment operations in the lab than on-road as well as smaller fuel consumption on-road for the 2
- 30 vehicles. This is supported by the comparison between fuel consumption on-road and on the roller bench for Vehicle 2 (Table 6 and Table 7, driving distance of WMTC = 13.1 km): a comparable fuel consumption is related to comparable CO_2 emissions (Figure 7. Summary of real driving and laboratory emission factors. Roller bench emissions were obtained with laboratory instrumentation (green circles) and the Mini-PEMS (green squares). Grey bars are average real driving emission

factors obtained with the Mini-PEMS from on-road cold start (blue squares) and hot start tests (orange squares). Error bars appear only on the first column in order to preserve readability.7).

In conclusion, the Mini-PEMS can be deployed on-road with minimum effort and little safety precautions (secured rack and fasten cables) and has enough resolution to distinguish different test severity, driving behaviour, and cold/hot engine start

5 conditions.

4 Conclusions

We presented an exploratory study aiming at assessing miniature portable emission measuring system (Mini-PEMS) suitable to be installed on-board of 2-wheelers (such as scooters and motorcycles) given its small size and weight. The Mini-PEMS, designed at the Technical University of Liberec, is capable of measuring the exhaust concentrations of hydrocarbons (HC),

- 5 carbon monoxide (CO) and dioxide (CO₂), and nitrogen oxides (NO and NO₂) using non-dispersive infrared and electrochemical cell techniques. In addition, it acquires a series of engine and vehicle parameters such as exhaust and inlet air temperatures, manifold absolute pressure, engine and vehicle speed and GPS coordinates of on-road trips. These are used by the Mini-PEMS to calculate the exhaust flow and the emission factors in mass/distance units.
- The Mini-PEMS was tested on three 2-wheelers (1 moped and 2 motorcycles) and compared with standard bench instrumentation inside the emission test cell of the European Commission Joint Research Centre (JRC, VELA laboratories) during legislative driving cycles. As an application, the Mini-PEMS was deployed on-board of the same vehicles during repeated on-road trips in order to measure real-driving emissions. The mean absolute deviations of exhaust gas concentrations were 8% for HC (range -17 to +16%), 8% for CO (-3 to +19%), 13% for NO_x (-12 to +24%) and 2% for CO₂ (-7 to +5%) In terms of emission factors, which include the exhaust flow uncertainty, the differences were 7% (-17 to +10%)
- 15 for HC, 7% (-4 to +14%) for CO, 9% (-22 to +2%) for NOx and 5% (-4 to +11%) for CO₂. For one vehicle where fuel consumption was measured directly with a dedicated fuel flow meter, the absolute deviations between fuel consumption over the legislative driving cycle measured in the laboratory and calculated by the Mini-PEMS with a carbon balance method (mass emissions of HC, CO and CO₂) were in the range 1-3%.
- On-road tests were not designed to be representative of typical operation of 2-wheelers (which at present are neither agreed nor proposed in the scientific literature and EU legislation). The real-driving emissions had larger variability than in the laboratory (up to a factor of 2 against typically 10%). HC and NOx emissions on-road were similar or larger than in the laboratory, CO emissions were larger on-road for the motorcycles and smaller for the moped (because of shorter periods of high engine load in the laboratory). At present, it is not possible to draw general conclusions on the real-driving emission results as they were vehicle- and compound- specific, but there are indications on what to focus on for future studies, namely
- 25 HC emissions after cold engine start or cold ambient conditions and CO emissions during prolonged periods of high engine loads.

All in all, the results are satisfactory considering that (i) the size and weight of the Mini-PEMS is smaller than standard PEMS instruments deployed in passenger cars, (ii) the detectors are different, simpler and cheaper, (iii) the external gas line is unheated, (iv) the exhaust flow is calculated and not directly measured, (v) the exhaust flow is not kept at 190 °C inside the

- 30 instrument, (vi) large vibrations and the presence of frequent bumps on the road. The Mini-PEMS has certainly the potential to be employed for research and development purposes, in periodical road worthiness tests when excessive emissions indicate malfunctioning of after-treatment devices and in the preliminary phases of an in-service monitoring.
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Author contribution

MV, LD and MP have designed and fabricated the Mini-PEMS.

MV performed the Mini-PEMS data analysis and prepared the manuscript.

AAZ performed the analysis of roller bench emissions data, drove the vehicles outdoor, and contributed to text and Figures.

5 LD and MP adapted the vehicles and installed the Mini-PEMS on-board.

FF, FM, MC assisted during Mini-PEMS installation and followed the vehicle on-road for safety reasons. BG and MG supervised the experimental activity, reviewed and edited the manuscript.

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Tables

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Table 1. Vehicles' technical specifications. All vehicles were equipped with a 4-stroke spark-ignition engine and a constant variable transmission. The reported driving cycle is the actual test cycle used in this work, and not the type-approval; see text for details. Notes: ⁽¹⁾Type and Category according to Regulation EU No.134 (EC, 2014); ⁽²⁾MP = medium performance; ⁽³⁾2w = 2-way oxidation catalyst, 3w = 3-way catalyst; ⁽⁴⁾carb = carburettor, inj = injection; ⁽⁵⁾WOT = wide-open throttle.

Parameter		Vehicle	Vehicle							
		1	2	3						
Type ⁽¹⁾		Moped	MP ⁽²⁾ Motorcycle	MP Motorcycle						
Category		L1e-B	L3e-A2	L3e-A2						
Capacity	$[cm^3]$	50	300	150						
Power	[kW]	2.5	16	9.5						
Mileage	[km]	4500	1500	1200						
Year		2010	2015	2015						
Emissions		Euro 2	Euro 3	Euro 3						
Mass	[kg]	85	180	130						
After-treatment ⁽³⁾		2w	3w	3w						
Fuel system ⁽⁴⁾		carb	inj	inj						
Cycle ⁽⁵⁾		R47/WOT	WMTC 2-2	WMTC 2-1						

Parameter	Driving cyc	les ⁽¹⁾		On-road trip				
	ECE R47	WMTC 2-1	WMTC 2-2	Vehicle 1	Vehicle 2	Vehicle 3		
Total distance [m]	6 259	12 287	13 177	2 242	2 245	2 240		
Total time [s]	896	1 200	1 200	398	189	235		
Drive time [s]	776	1 041	1 046	368	186	218		
Temperature [şC]	25	25	25	7	15	22		
Average driving								
speed [km/h]	25.1	36.9	39.5	21.1	42.8	35.0		
Maximum speed [km/h]	45.0	82.5	94.9	40.5	82.5	71.90		
Speed [km/h] [25 th , 75 th] percentile	[20.0,42.8]	[21.9,55]	[23.5,59.5]	[13.8,30.8]	[25.2,60.7]	[20.5,52.8]		
Average positive acceleration [m/s ²]	1.25	0.42	0.47	0.32	1.02	1.02		
Positive acceleration [m/s ²] [25 th , 75 th] percentile	[1.26,1.26]	[0.11,0.66]	[0.11,0.61]	[0.12,0.34]	[0.56,1.42]	[0.19,1.66]		

Table 2. Roller bench driving cycles and on-road trip parameters. Notes: ⁽¹⁾Calculated from speed profiles as in UNECE Regulation No. 47 and Regulation EU 134/2014 (EC 2014).

Table 3. Mini-PEMS technical details.

Compound/	Method	Range/Value	$LOD(^{1})$	T ₀₋₉₀ [s]
Parameter				
НС	NDIR	0-24000 ppmC	14 ppmC	2-3
СО	NDIR	0 - 12%	0.004%	2-3
CO_2	NDIR	0 - 20%	< 0.01%	2-3
NO	Electrochemical cell	0 - 5 000 ppm	3 ppm	3-5
NO_2	Electrochemical cell	0 - 300 ppm	1 ppm	15-30
$PN(^2)$	Ionization chamber	$\approx 10^7 \text{ #/cm}^3$	$\approx 5 x 10^5 \ \text{\#/cm}^3$	5-10
MAP	Pressure Transducer	0 - 250 kPa abs.	N/A	< 1
rpm	Coil pickup	0 - 20 000 min ⁻¹	N/A	< 1s
	Vibration sensor			
	Optical sensor			
Size No. 1		45 x 31 x 18 cm		
Weight No. 1		13 + 4.7 + 3.4 kg		
Size No. 2		40 x 20 x 20 cm		
Weight No. 2		$\approx 10 \text{ kg}$		

(¹) LOD – limit of detection, calculated as 3 x standard deviation of noise when sampling ambient air

(²) Particle Number from total particle length.

Table 4. Comparison of HC, CO, NOx and CO₂ raw exhaust concentrations ([ppm]) measured with the standard test cell instrumentation (bench) and the Mini-PEMS No.1 during legislative test cycles (WMTC and R47) and wide open throttle tests (Vehicle 1) on the roller bench. Dev = deviation; MAPD = mean absolute percentage deviation; min/max = minimum/maximum deviations. $(^{1})$ Tests performed with additional Mini-PEMS No. 2.

Test	Veh.	Cycle	Start	НС			СО			NO			CO ₂		
				Bench	PEMS	Dev	Bench	PEMS	Dev	Bench	PEMS	Dev	Bench	PEMS	Dev
				[ppm]	[ppm]	[%]	[ppm]	[ppm]	[%]	[ppm]	[ppm]	[%]	[ppm]	[ppm]	[%]
1	1	R47	Cold	1744	1455	-17	8289	8417	2	222	276	24	119111	124998	5
2	1	R47	Hot	1673	1550	-7	11657	13263	14	177	171	-3	118131	119537	1
3	1	WOT	Hot	3215	3722	16	14051	14549	4	252	220	-12	115970	108021	-7
4	1	WOT	Hot	1978	2089	6	13189	12741	-3	217	194	-11	113697	113629	0
MAPD	1	R47,WOT	-	-	-	11	-	-	6	-	-	13	-	-	3
5	2	WMTC	Cold	789	778	-1	2201	2460	12	151	181	20	137897	136604	-1
6	2	WMTC	Cold	837	803	-4	1945	2098	8	134	146	9	141598	140958	0
7	2	WMTC	Hot	309	286	-8	1277	1346	5	119	129	9	141007	140177	-1
MAPD	2	WMTC	-	-	-	4	-	-	8	-	-	12	-	-	1
8	3	WMTC	Cold	1134	1197	6	3626	4325	19	160	189	18	141634	141173	0
MAPD	All	All	-	-	-	8	-	-	8	-	-	13	-	-	2
min		All	-	-	-	-17	-	-	-3	-	-	-12	-	-	-7
max		All	-	-	-	16	-	-	19	-	-	24	-	-	5
5(¹)	2	WMTC	Cold	789	757	-4	2201	2329	6	151	172	14	137897	136858	-1
6(¹)	2	WMTC	Cold	837	568	-32	1945	2140	10	134	156	16	141598	142296	0
7(¹)	2	WMTC	Hot	309	238	-23	1277	1345	5	119	128	8	141007	140796	0
MAPD	2	WMTC	-	-	-	20	-	-	7	-	-	13	-	-	0

Table 5. Fuel consumption calculated from laboratory instrumentation (bench) and Mini-PEMS compared to the KMA fuel flowmeter (reference). Volumetric and mass consumption from the bench were derived from Regulation EU 134/2014 (carbon balance, diluted emissions) and from instantaneous mass emissions, respectively.

Test	KMA		Bench				PEMS-1		PEMS-2		
	[mL/test]	[g/test]	[mL/test]	Dev%	[g/test]	Dev%	[g/test]	Dev%	[g/test]	Dev%	
Test 5	446	330	415	-7	303	-8	320.5	-3	324.2	-2	
Test 6	460	341	422	-8	308	-10	339	-1	345.8	1	
Test 7	437	324	408	-7	288	-11	316.2	-2	316.8	-2	

Table 6. Comparison of emissions factors measured with the standard test cell instrumentation (bench) and the two Mini-PEMS during legislative test cycles (WMTC and R47) on the roller bench. Variable volumetric efficiency was assumed (see text for details). (1)Tests performed with the additional Mini-PEMS No. 2.

Test	Vehicle	Cycle	Start	HC			СО			NOx			CO ₂		
				Bench	PEMS	Dev	Bench	PEMS	Dev	Bench	PEMS	Dev	Bench	PEMS	Dev
				[g/km]	[g/km]	[%]	[g/km]	[g/km]	[%]	[g/km]	[g/km]	[%]	[g/km]	[g/km]	[%]
1	1	R47	Cold	0.210	0.192	-8	2.681	2.643	-1	0.142	0.145	2	65.59	65.92	0
2	1	R47	Hot	0.192	0.200	4	3.928	4.022	2	0.093	0.073	-22	59.23	56.76	-4
MAPD	1	R47	-	-	-	6	-	-	2	-	-	12	-	-	2
5	2	WMTC	Cold	0.115	0.113	-2	0.814	0.930	14	0.142	0.143	1	72.47	77.16	6
6	2	WMTC	Cold	0.110	0.122	10	0.744	0.843	13	0.129	0.125	-3	73.77	81.67	11
7	2	WMTC	Hot	0.056	0.047	-17	0.563	0.611	9	0.117	0.108	-7	71.86	75.15	5
MAPD	2	WMTC	-	-	-	9	-	-	12	-	-	4	-	-	7
8	3	WMTC	Cold	0.122	0.127	3	0.904	0.87	-4	0.131	0.109	-16	57.16	54.97	-4
MAPD	All	All	-	-	-	7	-		7	-		9	-	-	5
Min	All	All	-	-	-	-17	-	-	-4	-	-	-22	-	-	-4
Max	All	All	-	-	-	10	-	-	14	-	-	2	-	-	11
5(¹)	2	WMTC	Cold	0.115	0.113	-2	0.814	0.908	12	0.142	0.137	-3	72.47	78.08	8
6(¹)	2	WMTC	Cold	0.110	0.084	-24	0.744	0.911	22	0.129	0.134	4	73.77	83.32	13
7(¹)	2	WMTC	Hot	0.056	0.038	-32	0.563	0.617	10	0.117	0.102	-11	71.86	75.34	5
MAPD	2	WMTC	-	-	-	19	-	-	15	-	-	7	-	-	9

Table 7. Exhaust concentrations (average), real-driving emissions factors and fuel consumption during on-road trips.

Trip	Vehicle	Start	HC	СО	NOx	CO ₂	НС	СО	NOx	CO ₂	Fuel
			[ppm]	[ppm]	[ppm]	[ppm]	[g/km]	[g/km]	[g/km]	[g/km]	[g/km]
1	1	Warm	3732	8895	335	106491	0.378	1.885	0.159	48	16.6
2	1	Hot	4037	5074	382	113468	0.426	1.256	0.182	51	17.3
3	1	Hot	3603	9349	328	121711	0.286	1.530	0.138	48	16.3
1	2	Cold	803	3947	276	119305	0.152	2.447	0.230	79	26.5
2	2	Hot	554	2476	271	115105	0.096	1.230	0.340	75	24.5
3	2	Hot	521	4785	371	115589	0.093	2.538	0.350	72	24.3
1	3	Cold	2099	17088	239	103994	0.256	6.218	0.104	45	17.7
2	3	Hot	1122	13423	293	101117	0.163	4.581	0.127	41	15.5
3	3	Hot	1078	14923	238	100000	0.160	5.054	0.098	39	15.1

Figures



Figure 1. Schematic of the test cell and laboratory instrumentation. Exhaust emission measurements are performed at the tailpipe and after dilution through a constant volume sampler (flow rate $\approx 5m^3/min$) by two independent gas analyzer systems. The Mini-5 PEMS collects part of the raw exhaust; see text for details.



Figure 2. Schematic of the miniature portable on-board emissions monitoring system (Mini-PEMS); see text for details.



Figure 3. Upper panel: Comparison of the exhaust flow from bench instrumentation calculated with the CO_2 tracer method and from the 2 Mini-PEMS during Test 5. Lower panel: Comparison of fuel consumption (i) measured by a dedicated fuel flowmeter (KMA); (ii) calculated with the carbon balance method using HC, CO and CO_2 mass emissions rates from bench instrumentation; and (iii) calculated from Mini-PEMS No. 1 and No. 2.



Figure 4. Mass flow rates of HC, NOx, CO and CO₂ from bench instrumentation and from the two Mini-PEMS for Vehicle 2 during Test 5 (WMTC).



Figure 5. Emission factors of HC, NOx, CO and CO₂ from bench instrumentation (horizontal axis), and from Mini-PEMS No. 1 (vertical axis) obtained during roller bench tests. For Mini-PEMS no. 1, variable volumetric efficiency, error bars represent estimated known measurement uncertainty of 5% for Mini-PEMS and for laboratory, 3% for CO and CO₂, 5% (10% for 50 mg/km) for HC, 7.5 mg/km for NO_x.



Figure 6. Relative deviations (%) between PEMS and laboratory emission factors during roller bench tests. Red dashed lines represent the PEMS validation tolerances as per Regulation EU 2018/1832 (EC, 2018a); see text for details.



Figure 7. Summary of real driving and laboratory emission factors. Roller bench emissions were obtained with laboratory instrumentation (green circles) and the Mini-PEMS (green squares). Grey bars are average real driving emission factors obtained with the Mini-PEMS from on-road cold start (blue squares) and hot start tests (orange squares). Error bars appear only on the first column in order to preserve readability.