

# **LIFE Monza: comparison between ante and post-operam noise and air quality monitoring activities in a Noise Low Emission Zone**

Rosalba Silvaggio, Salvatore Curcuruto, Enrico Mazzocchi – Italian National Institute for Environmental Protection and Research, Physical Agents Unit, Via Vitaliano Brancati 48, 00144 Rome (Italy)

Francesco Borchì, Chiara Bartalucci, Lapo Governi, Monica Carfagni – Department of Industrial Engineering, University of Florence, Via di S. Marta 3, 50139 Firenze (Italy)

Raffaella Bellomini, Sergio Luzzi, Gianfrancesco Colucci – Vie en.ro.se Ingegneria s.r.l, Viale Belfiore 36, 50144 Firenze (Italy)

Giorgio Cattani, Alessandra Gaeta, Gianluca Leone, Alessandro Di Menno di Bucchianico, Mariacarmela Cusano – Italian National Institute for Environmental Protection and Research, Air Quality Monitoring Unit, Via Vitaliano Brancati 48, 00144 Rome (Italy)

Andrea Algieri, Cristina Colombi, Eleonora Cuccia, Umberto Dal Santo – Regional Environmental Protection Agency (ARPA) Lombardy, Via Rosellini, 17, 20124 Milan (Italy)

## **Abstract**

LIFE MONZA (Methodologies fOr Noise low emission Zones introduction And management) aims at defining an easy-replicable method for the identification and management of the Noise Low Emission Zones, urban areas subject to traffic restrictions, usually introduced in order to ensure compliance with the air pollutants limit values, whose impacts and benefits regarding noise issues have been tested in a pilot area of the city of Monza. Noise LEZ has been introduced in Libertà district, introducing infrastructural interventions carried out by the municipality (*top-down actions*) and encouraging an active involvement of the citizens, in the definition of a more sustainable lifestyle (*bottom-up actions*). Noise and air quality monitoring activities have been carried out in pilot area in *ante* and *post-operam* conditions and the results, able to describe the effects due to NLEZ establishment, are explained in this paper.

## **Keywords**

Environmental noise, Low Emission Zone, urban planning, top-down approach, bottom-up approach, noise monitoring system, air quality monitoring system

## **1. Introduction**

### **1.1 Project's background and objectives**

Exposure to noise, particularly caused by road traffic, is a major environmental problem in Europe, affecting millions of people and causing significant public health effects. An estimated 113 million people are affected by long-term day-evening-night traffic noise levels of at least 55 dB(A), based on Environmental Noise Directive implementation data [1]. The realization of Low Emission Zones (LEZs), urban areas subject to different kinds of road traffic restrictions, primarily introduced in order to ensure compliance with the air pollutants limit values set by the European Directive on ambient air quality 2008/50/EC, is a well-established measure carried out by the cities and the effects on air quality have been analyzed in detail, whereas the potential benefits about noise

have not been addressed in a comprehensive manner. Restrictions of road traffic in urban areas can be adopted through environmental zones, city tolls, congestion charging, distinguished by vehicle types, speeds and emission standards and the interventions are often used as urban redevelopment. LEZs have been introduced in many European countries, mostly in Italy, and different regulations [2], at national and local levels have been developed, causing the need of a comprehensive and integrated management process, particularly regarding the environmental effects.

LIFE MONZA addresses these issues, aiming at introducing an easy-replicable method, and related guidelines, for the identification and the management of the Noise Low Emission Zone (NLEZ), an urban area subject to traffic restrictions, whose impacts and benefits regarding noise issues have been analyzed and tested in the pilot area of the city of Monza, located in North Italy. The infrastructural interventions, able to turn up the pilot area of Libertà district in Monza in a permanent NLEZ, named *Top-down measures*, have been carried out by the municipality, and they are the restriction of vehicles speed, the definition of traffic zone with forbidden access to trucks, the lanes-width reduction and pedestrian crossings introduction and the substitution of the current asphalt with a silent one. In order to involve the inhabitants of the area, many different actions, named *Bottom up measures*, as lessons and meetings in primary and high schools to raise awareness about noise effects, ideas contest for students, *pedibus* service for schoolchildren, have been realized. Other objectives of the project were the evaluation of complementary effects on the air quality and benefits on wellbeing conditions of the residents.

## **1.2 Noise and air quality monitoring results in LIFE MONZA Noise Low Emission Zone**

Paper contents are focused on the monitoring strategy adopted for joint air quality and noise assessment before and after the Monza NLEZ establishment and the related main results and lessons learned that could allow replicability in future assessments.

Air pollution and noise are considered as major environmental risks for human health in Europe. Air pollution increases the incidence of a wide range of diseases and has several environmental impacts, damaging vegetation and ecosystems. The road transport sector provides a significant contribution to the total anthropogenic emissions, together with other mobile sources, non industrial combustion plants and combustion in energy and transformation industries. Control of exposure to air pollutants requires public authorities' actions at global, regional and local level. WHO produced and subsequently revised air quality guidelines [3,4] that contain recommendations of targets for air quality and limits for the concentration of selected air pollutants derived from epidemiological and toxicological evidence.

The Directive 2008/50/EC of the European Parliament and of the Council of 21 May 2008 on ambient air quality and cleaner air for Europe defined and established objectives for ambient air quality designed to avoid, prevent or reduce harmful effects on human health and the environment as a whole. The International Agency for Research on Cancer (IARC) concluded that there is sufficient evidence that exposure to outdoor air pollution causes lung cancer. Particulate matter was evaluated separately and was also classified as carcinogenic to humans [5].

Air pollution has been widely accepted and recognized by this time to have an impact in terms of cardio-vascular (CVD) as well as respiratory diseases than can lead to premature mortality. Ambient (outdoor air pollution) in both cities and rural areas was estimated to cause 3.7 million premature deaths worldwide in 2012 [6].

Atmospheric pollution is an extremely complex phenomenon. The burden of pollutant resulting from human activities and natural source evolves in time and space through the atmosphere. The

transport, dilution, transformation and deposition mechanisms are driven by specific reactivity of the substances and the meteorological conditions, that are as well largely variable in time and space, and govern the dynamics of air pollutants after emission. This lead to a non-linear relationship between emission and outdoor air pollutants concentrations.

Low emission zones (LEZs) have been established to reduce air pollutant emissions and to improve urban air quality in European countries. LEZs usually regulate the access to a zone depending on the vehicle emission standards or the vehicle type (heavy-duty vehicles, light-duty vehicles, moped etc.). LEZs may cover a variable area that can include few roads or a large part of an urban area. Those zones aim mainly at reducing exhaust emissions of traffic related pollutant, particularly PM and nitrogen oxides NOX. Policy measures (as LEZs) to reduce traffic by banning the most polluting vehicles are generally able to reduce circulating vehicles but they gave conflicting results on air pollution level [7, 8].

Exposure to environmental noise has impacts on human physical and mental health and well-being [9]. It is estimated to cause 12.000 premature deaths and contribute to 48.000 new cases of ischemic heart disease per year in Europe, that 22 million people suffer chronic high annoyance and 6.5 million people suffer chronic high sleep disturbance[cit.1].

The Environmental Noise Directive (END) 2002/49/EC relating to the assessment and management of environmental noise aims at defining a common approach to avoiding and preventing noise exposure, requiring the noise assessment through noise mapping, the adoption of action plans able to prevent and reduce environmental noise, also defining and preserving areas of good environmental acoustic quality (quiet areas), ensuring that information on environmental noise and its effects is made available to the public.

Recent studies suggested four pathways that could explain combined effects of air pollution and noise exposure on several cardiovascular events. It was suggested that within these adverse pathways air pollution and noise may overlap and act synergistically [10, 11]. In order to improve the knowledge on additive or synergistic effects of simultaneous noise and air pollution exposure in humans, monitoring strategies and exposure assessment methodologies development are needed. Only a few studies addressed additive or synergistic effects of air pollution and traffic noise exposure of in humans. Although most of them suggest that air pollution and traffic noise mostly act as independent risk factors of CVD incidence and mortality, the opposite effect was observed in some studies, suggesting the relevance of monitoring design as an important driving for the epidemiologic studies, particularly because the interpretation of results of studies on road traffic noise and air pollution is complicated by the appreciable collinearity of these two environmental risk factors, particularly when traffic is the main noise source [12].

Results of noise and air quality monitoring activities in NLEZ of LIFE MONZA enable an in-depth characterization of the urban area, allowing to investigate potential synergies existing between the monitoring methods of the two environmental components.

## **2. Noise and Air Quality monitoring methods in LIFE MONZA NLEZ**

### **2.1 Pilot area and implemented top-down interventions**

The pilot area selected in the framework of the LIFE MONZA project consists of the Libertà district of the city of Monza shown in Figure 1.

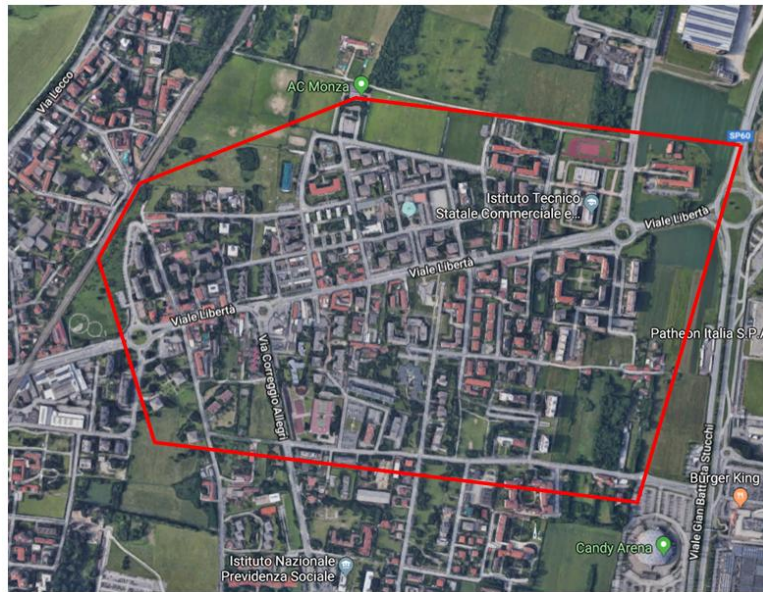


Figure 1. Perimeter of the pilot area ("Libertà" district, city of Monza).

In the selected pilot area a main road (Libertà street) and other roads affected by medium-low traffic are present. Significant average levels of noise pollution affect many citizens so that Libertà district is identified as a hotspot in the Action Plan of the city of Monza. The noise strategic map of the city of Monza, dated 2017, highlights that in a range of 30 m from the Viale Libertà almost the 100% of the receivers are exposed to levels higher than 65 dB(A) during the day and 55 dB(A) during the night.

With the aim to reduce the noise pollution in the pilot area two main interventions have been designed and implemented for the Libertà street: the laying of new low-noise paving and the closing of the road to the heavy vehicles. The low-noise asphalt represents the main instrument for the decrease, on large scale, of the traffic noise through interventions at the noise source and today several technologies are available based of composition, used materials and field of use.

For the laying of the asphalt, the typology "Dense graded at optimized weaving" has been chosen, which guarantees results of 3-4 dB(A) in term of acoustic abatement and an efficiency period about five years from the laying. This road surface has already been defined by "Progetto Leopoldo" whose results have been recognized by a deliberation of Regione Toscana in 2013 [13]. Progetto Leopoldo aimed to define a guideline for the design, building, control and maintenance of ordinary viability in Tuscany. This guideline allows to identify technologies, materials and kinds of interventions with the scope to improve the safety of the circulation and at the same time guarantees requests of eco-compatibility and duration. In the sample studied at Lucca, four years after the works a reduction of 5 dB(A) has been measured. In Figure 2 the section of Viale Libertà interested by the new asphalt laying is shown. In this road the work has foreseen the removal of the old road surface and the laying of 4 cm of link layer of Binder and following 4 cm of use-surface in Dense Graded.

The works to lay the new low-noise asphalt has started on Monday 17 September 2018 and finished on Saturday 22 (Fig.3).

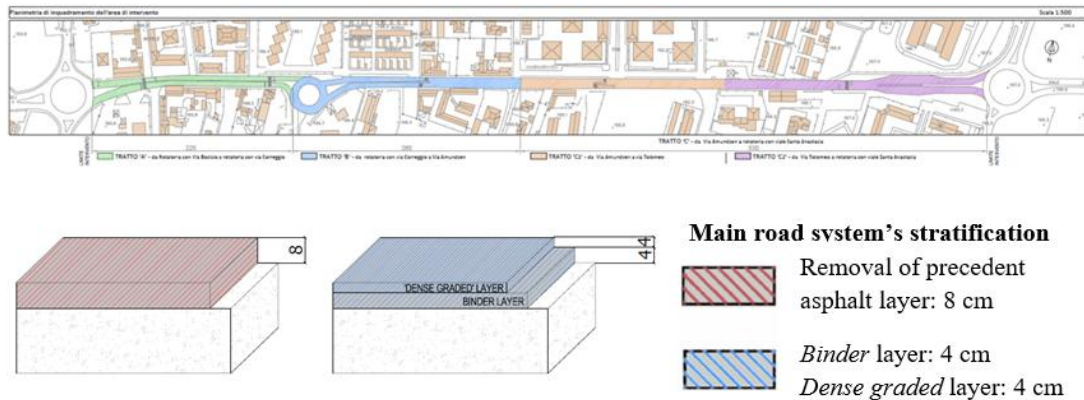


Figure 2. Detail of the design of low-noise pavement in Viale Libertà - Monza.

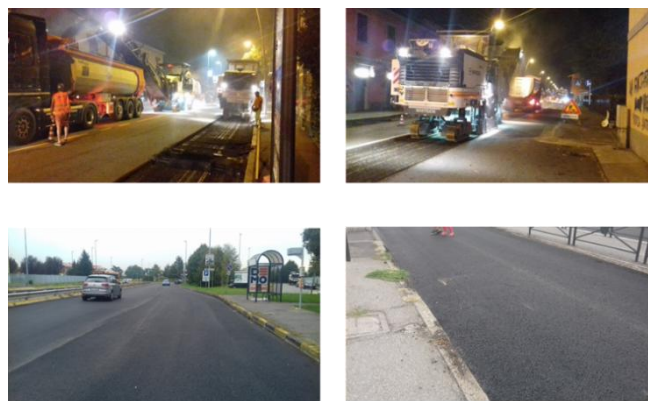


Figure 3. Works for the laying of new low-noise road surface in Viale Libertà (September 2018).

Regarding the limitations of the traffic in the pilot area of Libertà district, the first one has started since 21 January 2019 and will continue up to the end of June 2020.

## 2.2 Structure of noise monitoring network (smart + traditional)

Among the activities carried out in the LIFE MONZA project, the noise monitoring has played a central role.

In fact, it been planned both in the ante and post operam scenario, by using of both the class I instrumentation and a new low cost monitoring sensor network developed into the project [14, 15], in order to study the efficiency of interventions planned to reduce the traffic noise in this area. Moreover, some counter-traffic units were put in place to monitor road traffic flows.

In Figure 4 the noise monitoring positions are shown, together with the positions of counter-traffic control units and low-cost sensors (*Smart Noise Monitoring System "SNMS"*) to evaluate noise pollution both in ante and post scenario.



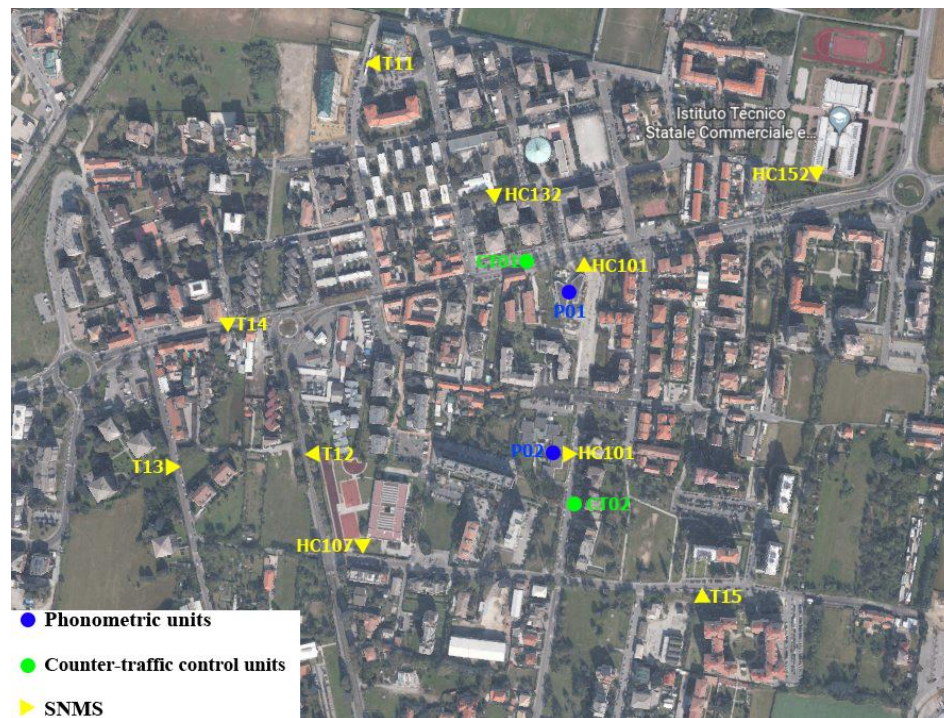


Figure 4. Different kind of measuring systems and related positions to monitoring noise in the pilot area.

### 2.3 Class I Noise Monitoring System

For the correct determination of the levels expected in front of the receptors, an ante-operam and post-operam monitoring have been planned at some specifically identified receivers. In particular, it was planned to carry out weekly measurement campaigns in both the Spring/Summer period and the Autumn/Winter period relating to both noise measurements and traffic flows. The instrumentation used to perform noise measurements complied with the class I requirements according to regulations IEC 651 – EN 60651 and IEC 804 – EN 60804. These noise monitoring campaigns consisted of long-term monitoring campaigns (one-week duration) and short-term monitoring campaigns (one-hour duration).

In particular, the long-term monitoring campaign consists of a week noise monitoring and a week road-traffic counting in 2 positions located in external environment and in P01- Civic Centre and in P02- School Modigliani (see Figure 4). The microphones were placed on the roofs of the interested receivers, facing the roadway. The counter-traffic control units (CT01 and CT02) have been positioned on the roadside, whose results evidence the subdivision in light and heavy vehicles in the time slots subject to phonometric measurements.

In the Autumn/Winter period, the ante-operam monitoring was carried out in the period between Monday 20 and Monday 27 November 2017, while the post-operam monitoring was carried out between Monday 21 and Monday 28 January 2019.

Likewise, in the Spring/Summer period, the ante-operam monitoring was carried out in the period between Monday 15 and Tuesday 23 May 2017, while the post-operam monitoring was carried out between Monday 6 and Tuesday 14 May 2019.

### 2.4 Smart Noise Monitoring system

The Smart Noise Monitoring System (SNMS) network is meant to adequately cover the pilot area and the different types of roads. As illustrated in Figure 4, 10 monitoring stations have been

installed in the pilot area. In particular, 3 microphones have been placed along Viale Libertà, the main street where the traffic flow mix is expected to mainly change from ante to post-operam scenario. The other microphones have been uniformly distributed along other streets belonging to the pilot area [16]. The SNMS technical specifications were defined in [17] keeping in mind the aim of a long-term monitoring of acoustic parameters. These are expected to be useful to understand the variability of acoustic climate in the pilot area with mainly reference to the overall A-weighted continuous equivalent sound pressure level.

The 10 prototypes of the monitoring stations have been installed in the pilot area in June 2017 and, at the end of the LIFE MONZA project, will be given for free to the city of Monza that will take care of using them for monitoring activities in the three years after LIFE period.

## **2.5 Structure of air quality monitoring network**

To achieve the project's objectives both temporal and spatial air pollution variability was to be assessed.

### *2.5.1 Temporal pattern*

The concentration levels of the main air pollutants and some components of the particulate matter were measured inside and outside the NLEZ.

Sampling was carried out using a mobile laboratory located in Viale della Libertà (inside the NLEZ). Results were compared with those contemporary taken at a fixed site located nearby (via Machiavelli), outside the LEZ, and in a 20 km buffer around the Viale della Libertà, all belonging to the regional air quality network.

Several regulated pollutants (Directive 2008/50/EC) - airborne particulate matter (PM<sub>2.5</sub>, PM<sub>10</sub> mass concentration), nitrogen dioxide (NO<sub>2</sub>), sulfur dioxide (SO<sub>2</sub>), benzene (C<sub>6</sub>H<sub>6</sub>), carbon monoxide (CO) and ozone (O<sub>3</sub>) - were determined, using the respective European reference/equivalent methods (Directive 2008/50/EC).

Hourly (SO<sub>2</sub>, CO, NO<sub>2</sub>, NO<sub>x</sub>, C<sub>6</sub>H<sub>6</sub>, O<sub>3</sub>) and daily (PM<sub>10</sub>, PM<sub>2.5</sub>) averages were calculated.

PM<sub>10</sub> samples were collected on quartz membrane filters: following the CEN/TR 16264:2011, these samples were analyzed to determine the carbonaceous component with TOT/TOR (Thermal-Optical Transmittance/Reflectance) instrumentation (Sunset Laboratory) which, by means of a thermo-optical process, allows to quantify the organic carbon (OC) and the elementary carbon (EC).

Continuous measurement of black carbon (BC), based on and aerosol light absorption properties were carried out using a Multi Angle Absorption Photometer (MAAP, Thermo).

Moreover, the particle number concentration (PNC) and size distribution in the 0.3 ÷ 10 µm range, were measured with aerosol particle sizers (OPC, Grimm, mod. 107) capable of counting particles with dimensions greater than 0.25 µm and classifying them into 31 dimensional classes.

Basic meteorological data (temperature, relative humidity, atmospheric pressure, rainfall, solar radiation, relative and absolute humidity, wind speed and direction) were taken from surroundings meteorological stations belonging to the regional meteorological service. Atmospheric profile data from the Milan Linate station were used to estimate the atmospheric *mixing layer height* (MLH).

*Ex ante* measurements were carried out in 2017/2018, (1 campaign representing each season) and was repeated during 2019 with the same schedule (Table 1).

Table 1. ex-ante/ex-post monitoring campaigns, sites and pollutants

<b>monitoring campaigns</b>	
ex-ante	ex-post
I (04 -22 may 2017)	I (20 feb -26 mar 2019)
II (14 - 31 jul 2017)	II (08 - 21 may 2019)
III (9 - 30 nov 2017)	III (03 - 17 jul 2019)
IV (31 jan - 19 feb 2018)	IV (30 oct - 21 nov 2019)
<b>Pollutants</b>	
SO <sub>2</sub> , CO, O <sub>3</sub> , NO <sub>2</sub> , NO <sub>2</sub> p.s. *, Benzene p.s. *, Benzene, Toluene PM <sub>10</sub> , PM <sub>2,5</sub> , BC, OC, EC, TC, PNC	
<b>Site</b>	
Viale Libertà, 144, 20900 Monza MB	
* passive samplers	

### 2.5.2 Spatial pattern

To assess the spatial and seasonal variability on the microscale (i.e. in the territory delimited by the NLEZ) of some pollutants tracing the emissions of internal combustion engines, empirical models were developed.

The study domain was a 4 km<sup>2</sup> square area around the sampling point located in Viale della Libertà assumed as the domain's and NLEZ's center.

Vehicular traffic related pollutants (benzene, toluene, NO<sub>2</sub>) sampling was made also using passive samplers (Ring, Aquaria and Radiello, Fondazione Maugeri, respectively for VOC's and NO<sub>2</sub>).

Duplicate samplers, provided with weather protective shelters, were deployed at 2.5 m above the ground, placed on lamp post, utility poles or street signals.

Aromatic volatile organic compounds (VOCs) were extracted with carbon disulfide then detected and quantified using internal standard capillary gas chromatography performed on a Gas Chromatograph (HewlettePackard Inc., USA) with MS detection. NO<sub>2</sub> measures was carried out by means a Ions Chromatography (Metrohm-881 Compact IC pro – Anion – MCS)

25 points were selected across the study domain to represent the microscale spatial variability of air quality variously distributed according to the distance from the main roads in the study domain (4 km<sup>2</sup>) both inside and outside the NLEZ. The sites represent a wide range of possible scenarios that characterize the NLEZ and surrounding area context. There were sites located less than 50 m from a high traffic road in densely populated neighbourhoods (traffic sites) as well as sites over 200 m from a high traffic road in low density residential areas (urban background sites).

Microenvironmental criteria for site selection [18,19] were strictly followed.

### 2.5.3 Spatial variability assessment using GAM model

Generalized additive statistical models [20] were developed which allow to estimate with high spatial resolution (20x20 m) in the study domain the concentration of pollutants monitored with passive samplers. GAM is a multivariate non-parametric method of analysis able to model the non-linear effects of a number of covariates, to assess any simultaneous and combined contribution to the response variables (benzene and toluene mean concentrations assessed during each monitoring campaign using passive samplers). Any non-linear relationship was modelled without having to specify the non-linear functional form.



### *GIS-derived predictor variables*

GIS-derived predictor variables related to road traffic flows, distances from nearest road, building volume representative of urban canyon, road length, land use variables by Urban Atlas of Copernicus Land Monitoring Service (commercial area, high density and low density area) were evaluated in each monitoring site and in varying buffer size (25, 50, 75 e 100 m). Details on variables calculation are provided in the Online Supplement Y, Table Y2. Starting from traffic flow measurements carried out using the counter-traffic control units described in section 2.1, traffic variables were estimated by attribution to each node within the study domain.

### *Model development*

The explanatory variables described have been selected as potential regressors in the GAM models starting from the correlation matrix with the response variable and performing a stepwise forward selection procedure with groups of variables on the basis of the best correlation with the response variable ( $p < 0.01$ ).

Test checks with various basis-dimension functions (k parameter) were performed to select the best splines for each variable. The smoothing parameter was chosen controlling the balance between likelihood function and overfitting, convergence of the iteration algorithm, the significance of the EDF (Effective Degree of Freedom) parameter which represents the complexity of smoothing in terms of curve sinuosity (the higher the EDF value the greater the spline non-linearity). Residual Normality was graphically checked.

### *Model evaluation*

The choice of the best model for each season and pollutant was done via the Akaike Information Criteria (AIC), the GCV (Generalized Cross Validation), the BIC (Bayesian Information Criterion) to control the improper adaptation phenomena due to overfitting.

Each model was validated with the Leave-One-Out Cross Validation (LOOCV) method [21]. The performance measures evaluated were the  $R^2$ , the adjusted  $R^2$  and the Root Mean Square Error (RMSE) values.

## **3. Results of Noise and Air Quality monitoring campaigns in LIFE MONZA NLEZ**

### **3.1. Ante and post-operam monitoring results for noise according to Class I Noise Monitoring System**

Referring to the long-term monitoring performed by using the class I instrumentation, taking as reference the position identified as P01 (Figure 5), located on the roof of the Civic Centre facing the Libertà street, the comparison between the monitoring activity carried out in November 2017 and in January 2019 has been made.

Referring to the traffic flow data, on the base of the road-traffic counting performed in the ante and post operam scenarios, it's possible to affirm that, in the time period "Day", there is a very good alignment between data of the ante and post-operam scenarios. Also in the "Evening" and "Night" periods the deviations of the traffic flows between ante and post-operam scenarios are of a small entity (lower than 10%). Finally, referring to heavy vehicles, in all the periods a reduction of the heavy vehicles in the order of 30% between the configuration ante and post-operam is appreciable.

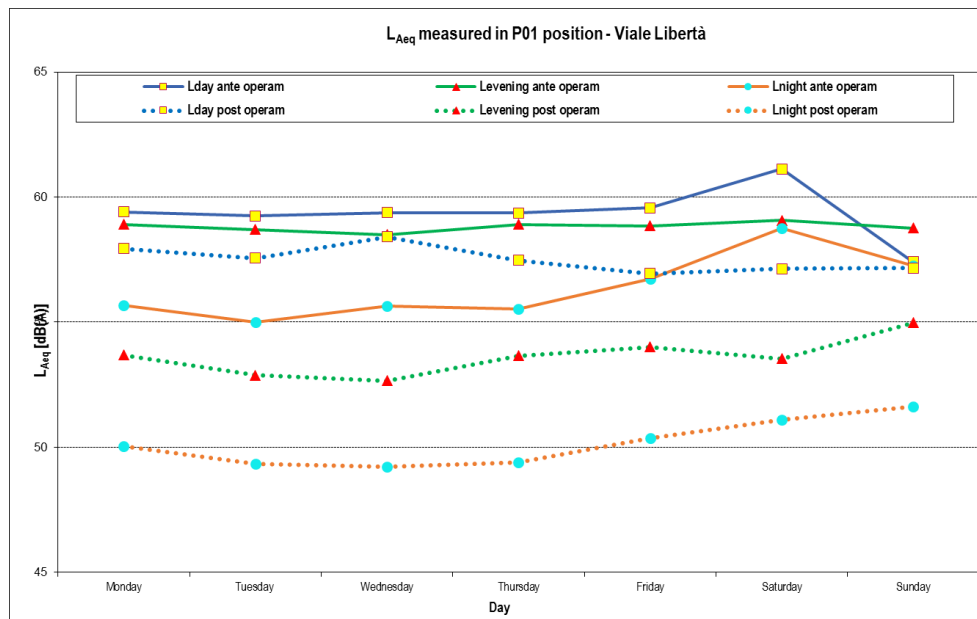


Figure 5. Comparison of sound pressure levels recorded in ante and post operam in the position of the Civic Centre P01

### 3.2 Ante and post-operam monitoring results for noise according to Smart Noise Monitoring system

With reference of one sensor placed along Libertà street (Figure 4), HC101, in this chapter the results of the two interventions achieved in the Libertà district (new low-noise pavement's laying and limitation of heavy vehicles passage) will be illustrated. This sensor has been placed in correspondence of the façade of the Civic Centre and the results take account of the façade's reflection. In particular, Figure 6 shows the contribution of the new laying of low-noise asphalt in Viale Libertà: on the left of the graphic the A-weighted continuous equivalent sound pressure level, "LAeq", is reported for a week before the intervention, in the middle of the diagram the sound pressure level recorded during the laying is present and in the right of the graphic there is the time history starting trend to one month after the works, recorded for eighteen days. The month after the works was not considered for analysis because it is a necessary period for the settling of the paving. Focusing on these first elaboration data, it is possible to see a visible noise reduction due to the laying of the new low-noise road surface.

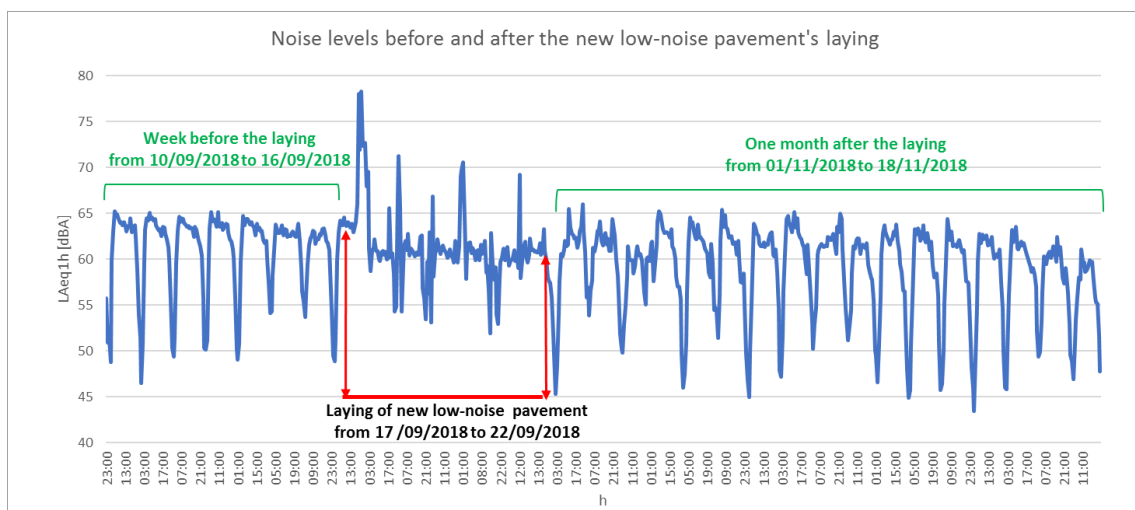


Figure 6. Noise levels recorded by the sensor HC101 before, during and after the laying of the new road surface

Furthermore, referring to the same sensor HC101, in Figure 7 the trend of noise levels in the week before and after the limitation of the passage for the vehicles larger than 3,5 ton (performed on 21st of January 2019), has been reported. However, in this case, the effect of this action is not clear visible on the time history of sound pressure level recorded.

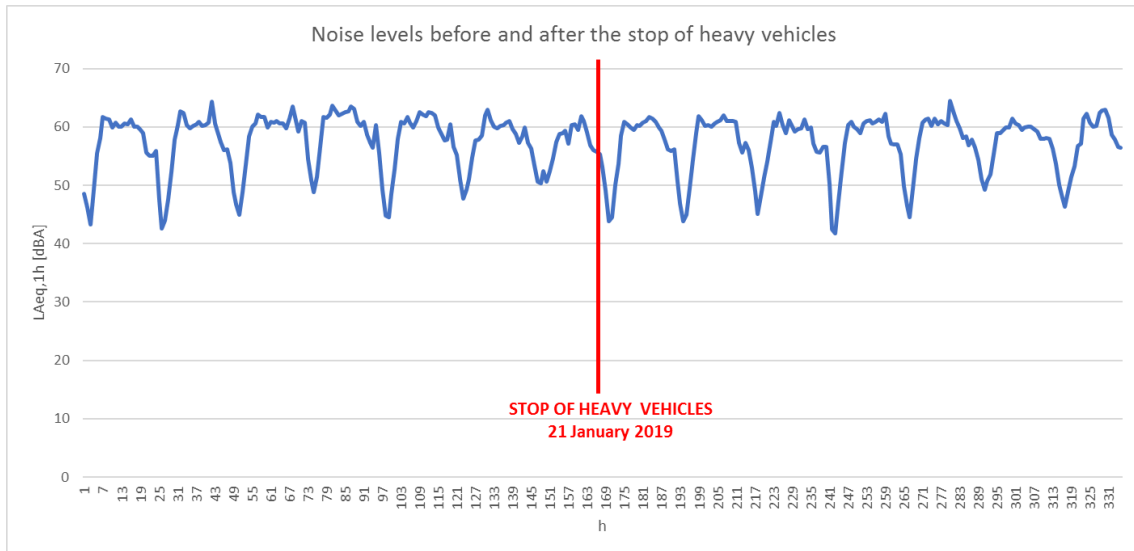


Figure 7. Noise levels recorded by the sensor HC101 before and after the stop of heavy vehicles

### 3.3 Validation of the smart system with a traditional noise measurement chain

Such as shown in the following table 2, the results of the noise monitoring carried out in January 2019 highlight a same and constant difference, about 3 dB, between the sound pressure levels recorded by low-cost sensor and class I systems in all periods analysed (Day, Evening and Night time). This difference is caused by the different position of the microphones. This stability of results seems to make the low-cost sensors usable for noise monitoring in the place of class I instrumentation.

Instead, in the measurements of November 2017 only in the “Night” period the difference cited above is equal to 3 dB, while in “Day” and “Evening” times there are bigger deviation probably due to the activities happened nearby of the entrance of Civic Centre and therefore near the sensor. In the light of these considerations, the results in “Day” and “Evening” periods haven’t been use for the comparison of the results.

Table 2. Analysis of the results obtained for the acoustic descriptor  $L_{day}$ ,  $L_{evening}$  and  $L_{night}$  by the low-cost sensors and class I systems.

	Period	Lday (06-20) [dB]	Levening (20-22) [dB]	Lnight (22-06) [dB]
Class I Instrumentation	Nov-17	59.5	58.8	56.5
Sensor HC101	Nov-17	64.6*	62.5*	59.2
	Difference	5.1	3.7	2.7
Class I Instrumentation	Jan-19	57.5	53.7	50.3
Sensor HC101	Jan-19	60.4	57.0	53.0
	Difference	2.9	3.3	2.7

Table 3. Comparison of the results obtained for the acoustic descriptor  $L_{day}$ ,  $L_{evening}$  and  $L_{night}$  between the two measurement systems used in the monitoring of the ante and post-operam.

	Period	Lday (06-20) [dB]	Levening (20-22) [dB]	Lnight (22-06) [dB]
Class I Instrumentation	Nov-17	59.5	58.8	56.5
	Jan-19	57.5	53.7	50.3
	Difference	2	5.1	6.2
Sensor HC101	Nov-17	-	-	59.2
	Jan-19	-	-	53.0
	Difference	-	-	6.2

### 3.4 Ante and post-operam monitoring results for air quality

#### 3.4.1 Air quality status and trend in the study area

The summary of the concentration's statistics at all the monitoring sites is given at Table 4.

Monza is a medium sized city belonging to a large urban agglomeration, Milan + 106 small town surroundings, the largest in the Po valley with 3593025 inhabitants. The Po Valley is largely devoted to intensive agricultural and livestock farming, as well as important industrial and commercial activity, producing ample amounts of NO<sub>x</sub> from vehicles, NH<sub>3</sub> from agricultural activities, PM from residential heating, mainly from biomass burning devices and COV from solvent use in industry, vehicles and from agricultural activities due to biogenic emissions.

Moreover, the presence of the Alps and the Apennine often limits the air currents between Northern Italy and the rest of continental Europe, favouring the accumulation of air pollutants. Figure 8 shows hourly distributions of the wind speed in the different measurement periods. Feeble ventilation and frequently wind-calm conditions, with typical mean wind speed around 1 m/s, and mechanical turbulence due to the wind therefore generally low, typical conditions that occur in the PO valley. Particularly winter seasons is characterized by frequent thermal inversion at low altitude and low mixing layer heights, high pressure and calm wind conditions so that the area is frequently plunged in a stable and stagnant atmosphere.

Table 4. Ex-ante and ex-post summary of the hourly pollutant concentration statistics (mean and standard deviation) at the four sites.

ex-ante	I (04 -22 may 2017)		II (14 - 31 jul 2017)		III (9 - 30 nov 2017)		IV (31 jan - 19 feb 2018)	
	mean ( $\mu\text{g}/\text{m}^3$ )	st.dev.	mean	st.dev.	mean	st.dev.	mean	st.dev.
SO <sub>2</sub>	3.7	1.4	3.9	2.1	5	1.3	5.3	2.2
CO ( $\text{mg}/\text{m}^3$ )	0.4	0.2	0.7	0.1	1.2	0.4	1	0.3
O <sub>3</sub>	90.3	31.7	142.4	31.3	--	--	11.1	7.6
NO <sub>2</sub>	37.6	8.8	26	6.6	47.1	8.9	56.9	8.6
NO <sub>2</sub> p.s.*	--	--	--	--	--	--	40.4	19.7
Benzene p.s.*	--	--	0.4	0.1	--	--	1.2	0.2
Benzene	--	--	0.3	0.1	3.3	1.8	2	1.1
Toluene	--	--	1.6	1.2	13.3	4.5	7	4.5
PM <sub>10</sub>	16.7	5.7	17.9	8	52.9	25.7	44.1	22.8
PM <sub>2,5</sub>	12.2	3.9	10.3	3.5	40.7	20.5	32.9	17.9
BC	2	1.2	1.7	1	6.7	3.4	4.3	2.5
OC	5.5	1	6.1	1.4	15.5	4.9	11.3	3.9
EC	1.6	0.4	1.4	0.4	4.7	1.7	2.7	0.9
TC	7.1	1.3	7.6	1.7	20.2	6.1	14	4.5
PNC (Cn cumulate pp/l) **	--	--	108127	18110	509673	91793	487016	69449
ex-post	I (20 feb -26 mar 2019)		II (08 - 21 may 2019)		III (03 - 17 jul 2019)		IV (30 oct - 21 nov 2019)	
	mean ( $\mu\text{g}/\text{m}^3$ )	st.dev.	mean	st.dev.	mean	st.dev.	mean	st.dev.
SO <sub>2</sub>	--	--	--	--	5.1	2.5	2.4	0.7
CO ( $\text{mg}/\text{m}^3$ )	0.8	0.2	0.6	0.3	0.7	0.3	0.9	0.2
O <sub>3</sub>	30.8	16.6	50.7	10.6	78.8	12.7	18.5	5.6
NO <sub>2</sub>	60.4	15.7	38.8	6.3	26.4	7.0	37.3	9.0
NO <sub>2</sub> p.s.*	35.4	2.5	30.9	3.3	22.0	2.5	22.5	2.9
Benzene p.s.*	0.9	0.04	0.7	0.1	0.5	0.01	1.4	0.1
Benzene	1.0	0.5	0.3	0.1	0.6	0.3	1.0	0.3
Toluene	5.0	3.9	2.0	0.8	3.5	1.7	4.3	2.1
PM <sub>10</sub>	38.3	16.2	16.0	4.4	19.7	6.1	20.9	6.3
PM <sub>2,5</sub>	--	--	--	--	15.3	3.9	15.9	5.3
BC	3.7	1.9	1.6	0.4	1.1	0.3	3.1	0.8
OC	9.0	8.9	4.5	0.6	6.1	1.0	6.6	1.5
EC	2.2	0.9	0.9	0.2	0.8	0.2	1.6	0.6
TC	11.1	4.1	5.4	0.7	6.9	1.2	8.5	2.0
PNC (Cn cumulate pp/l)	--	--	--	--	39170	6713	47621	10114

\* passive samplers      \*\* particle number concentration

Unit of measurement of pollutants [ $\mu\text{g}/\text{m}^3$ ]

At the same time, fog often forms in the valley in fall and winter when temperature inversions trap cool, moist and polluted air near the surface.

When fog forms, sulphur oxides, nitrogen oxides, and other polluting gases are taken up or 'scavenged' by fog water droplets. Once absorbed into the droplets, the gases oxidize more rapidly than they otherwise would, becoming sulphates, nitrates, and other types of aerosol particles. What the fog and humidity do is accelerate the process of converting gaseous pollutants into haze-causing aerosols.

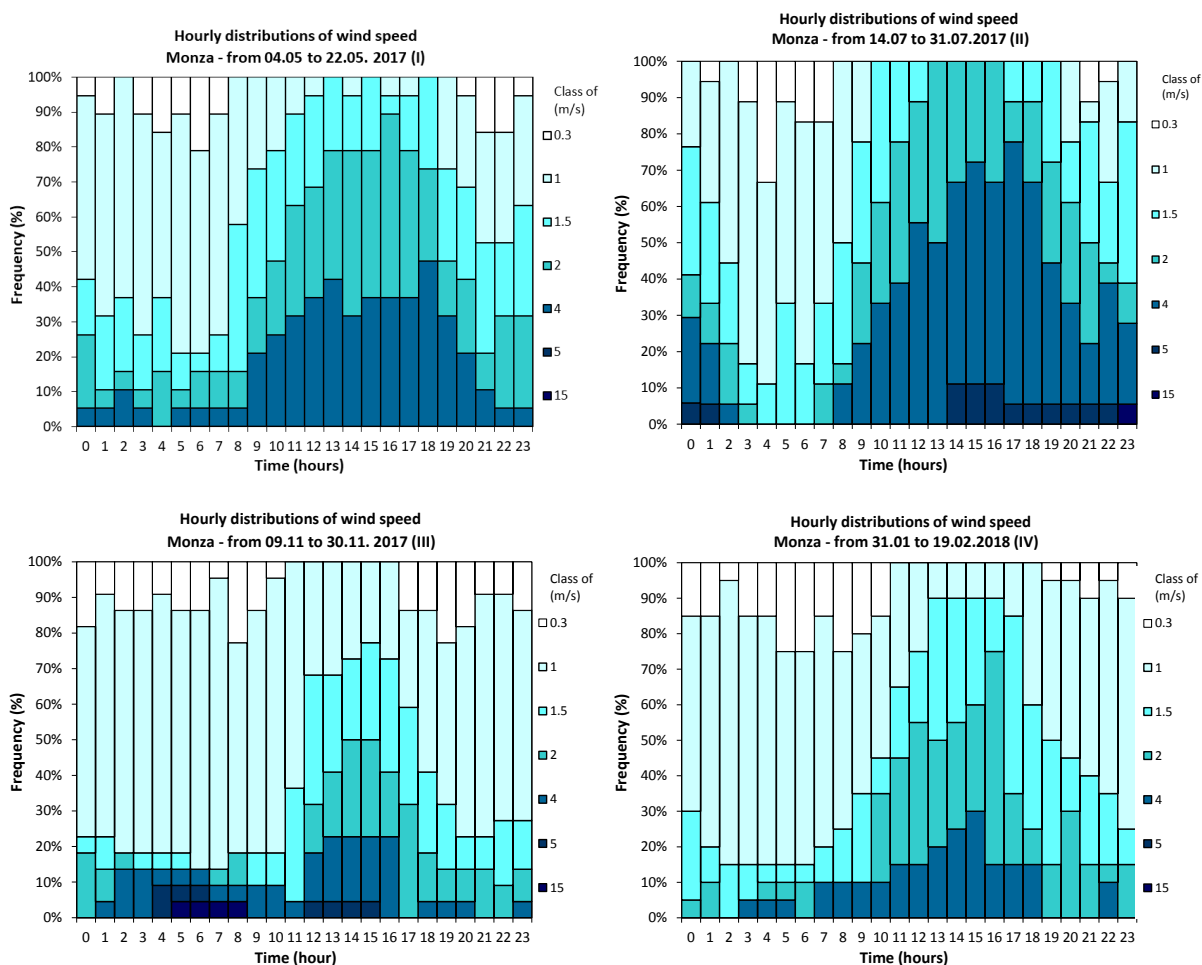


Figure 8. hourly distributions of the wind speed in the different measurement periods

Such extreme conditions favourable to pollutant accumulation, can last several days, as shown in Figure 9 that shows some meteorological parameters in different seasons. Usually the meteorological conditions that characterise the cold seasons are responsible for the rise in  $\text{NO}_x$  and other pollutants concentration in the Po Valley: as an example figure 10 shows the  $\text{NO}_x$  dependencies by wind speed and direction differences among seasons. .



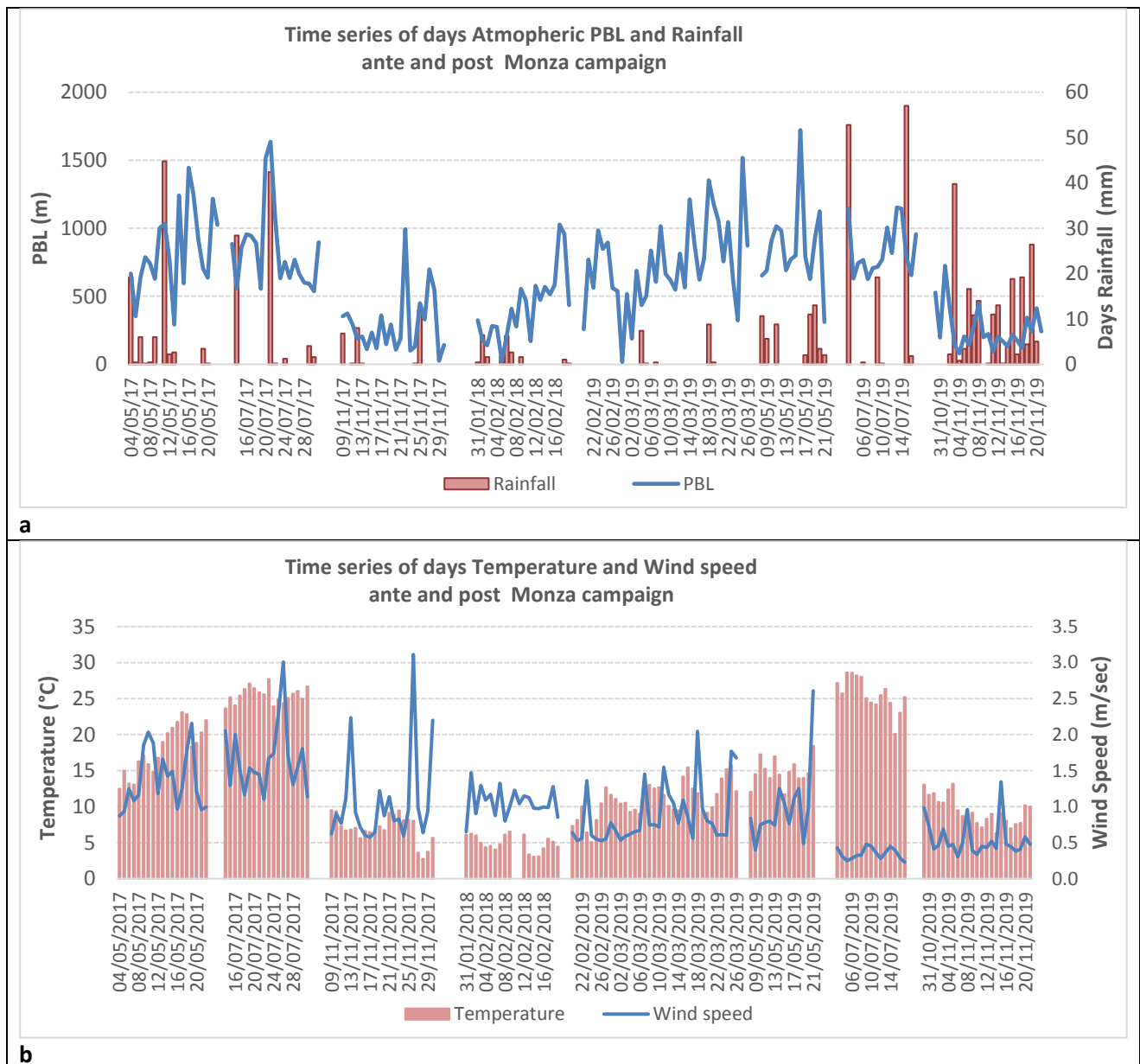


Figure 9: Monza. Ex-ante and post measuring campaign. Daily Temporal pattern for some atmospheric parameters.

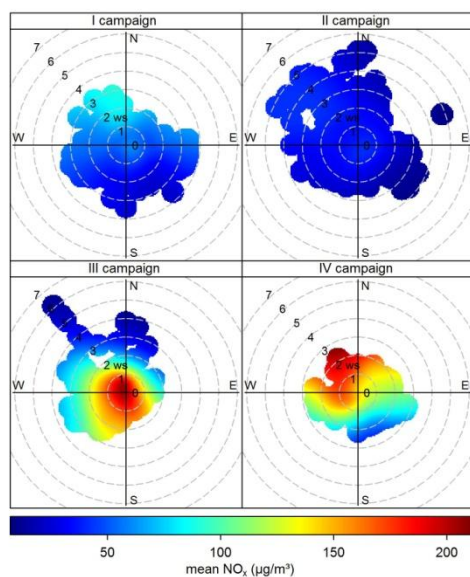


Figure 10. Monza, Viale della Libertà. Ex-ante measuring campaign. Polar plot showing the NO<sub>x</sub> mean concentrations variability by wind speed and direction. For each polar plot, the radial dimension is an indicator of wind speed (m/sec). Further away from the center of the plot, the wind speed is higher.

The atmospheric conditions that characterize the different seasons have important repercussions on the particulate matter levels and composition. PM<sub>10</sub> winter levels in the Po Valley's cities are significantly higher than those of the other major Italian cities, while this difference is less pronounced in the summer when the atmospheric phenomena described are less (Figure 11).

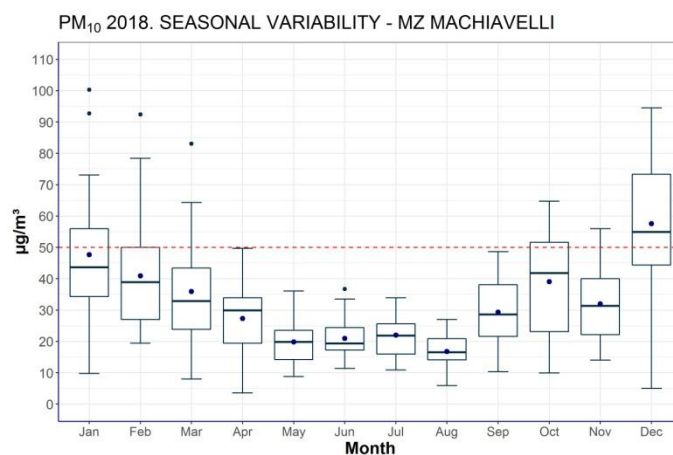


Figure 11: Monza, PM<sub>10</sub> daily averages distribution by month, showing typical seasonal variability.

The average daily concentrations of the "temporary" site of Monza - Libertà were compared with those of the whole Lombardy region's network and in particular with the same measured in the fixed station of Monza - Via Machiavelli. The measurements carried out at the two sites in Monza show consistent trends with each other particularly for traffic related pollutants and are generally above the 75th regional percentile, in line with the typical values detected in urban traffic stations and without presenting specific critical issues.

Moreover it's worth to note the excellent agreement between the PM10 and total carbon (OC + EC) measurements carried out in the NLEZ zone and those carried out far away within the Milan agglomerate, very consistent and contained in a narrow range of values (Figure 12).

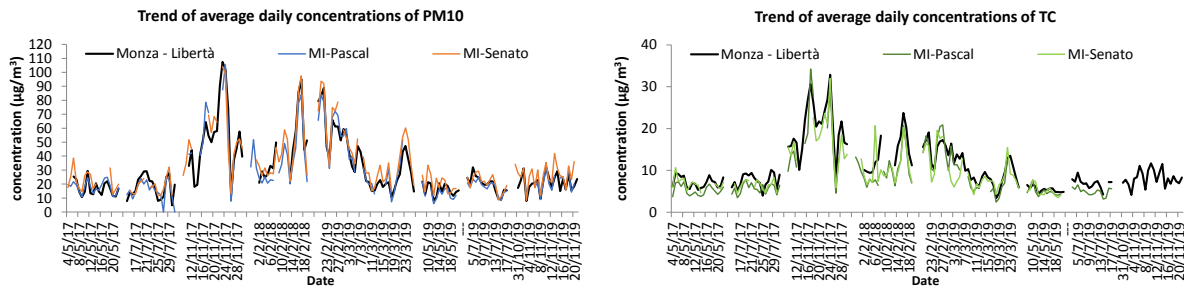


Figure 12. Average daily PM10 (a) TC (b) concentrations measured in Monza - Libertà compared with those measured in Milan - Pascal and Milan - via Senato.

The average values of the winter period were higher than those of the summer period in all the stations considered, as expected, partly due to the weather conditions more favourable to the accumulation of pollutants and partly due to the additional sources of pollution (e.g. heating buildings).

Noticeably, the OC fraction represents a large portion of PM10, with highest values (again) during winter (Figure 13).

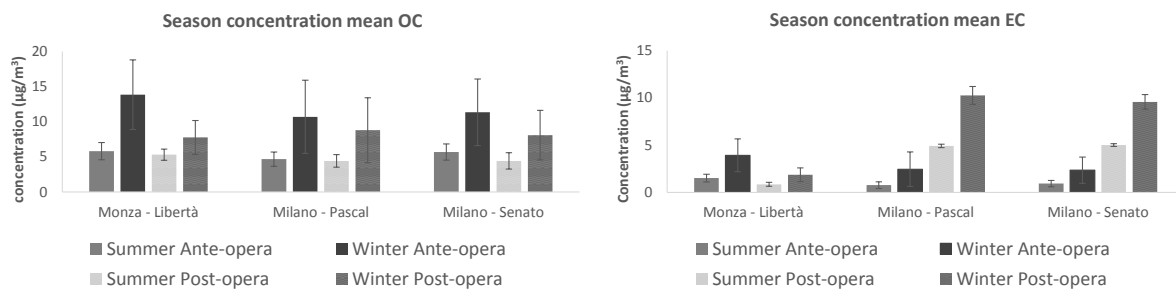


Figure 13. Average concentrations of OC and EC on the two measurement periods "summer" (from 4/5/2017 to 22/5/2017 and from 14/7/2017 to 31/7/2017 in ex-ante operam, from 8/5/ to 21/5/2019 and from 03/7/ to 17/7/2019 in ex-post operam ) and "winter" (from 9/11/2017 to 30/11/2017 and from 31/1/2018 to 19/2/2018 in ex-ante operam, from 20/2/ to 26/3/2019 and from 20/7/ to 21/11/2019 in ex post-operam).

The average OC concentration over the "winter" period was ever higher in Monza than in Milan, around  $4 \mu\text{g}/\text{m}^3$  during ex ante-opera campaigns, and  $1.6 \mu\text{g}/\text{m}^3$  during ex post-opera. In general, moving away from Milan downtown, towards the pre-Alpine and alpine area, the use of the wood as a heating source tends to increase, and this represents a not negligible carbon source.

### 3.4.2 Spatial variability assessment

Table 5 shows the benzene GAM models developed by season and period (ex-ante and ex post). Variables included were the sum of buildings volumes in a 75 m radius buffer and the ratio between the average daily traffic and the distance from the nearest road (vehicle/day\*m). For benzene, the summer model, ex ante phase, explains 80% of the deviance (adjusted-R<sup>2</sup> = 0.76, RMSE =  $0.14 \mu\text{g} / \text{m}^3$ ) while in winter, 77.8% (adjusted-R<sup>2</sup> = 0.69, RMSE =  $0.18 \mu\text{g}/\text{m}^3$ ). A very

similar pattern was found in the ex post phase, respectively in summer ( $R^2 = 70.1\%$ , adjusted- $R^2 = 0.65$ , RMSE =  $0.19 \mu\text{g} / \text{m}^3$ ) and in winter ( $R^2 = 70.5\%$ , adjusted- $R^2 = 0.66$ , RMSE =  $0.12 \mu\text{g} / \text{m}^3$ ). The models explained a large portion of variability (explained variance ranging between 70.5% and 80%).

*Table 5. Benzene, GAM models performance and summary statistics of leave one out cross-validation (LOOCV).*

	<b>R<sup>2</sup> adj</b>	<b>Explained variance</b>	<b>GCV</b>	<b>AIC</b>	<b>BIC</b>	<b>RMSE</b>
Summer ex-ante	0.756	80%	0.0054	-59.183	-51.409	0.14
Winter ex-ante	0.687	77.8%	0.019	-28.169	-17.938	0.18
Summer ex-post	0.649	70.1%	0.0852	-47.137	-40.351	0.19
Winter ex-post	0.663	70.5%	0.012467	-37.390	-31.288	0.12

Table 6 shows the toluene GAM models developed by season and period (ex-ante and ex post). Variables included were the sum of the volumes of the buildings in a buffer with a radius of 75 m and the ratio between the average daily traffic and the distance from the nearest road (vehicle/day \*m).

The same variables as for benzene were found to explain the toluene spatial variability. However, the toluene GAM models showed a lower explained deviance compared to that found for benzene. Summer ex –post levels were often lower than the method limit of detection, not allowing to develop a reliable model for this season.

*Table 6. Toluene, GAM models performance and summary statistics of leave one out cross-validation (LOOCV).*

	<b>R<sup>2</sup> adj</b>	<b>Explained variance</b>	<b>GCV</b>	<b>AIC</b>	<b>BIC</b>	<b>RMSE</b>
Summer ex-ante	0.613	67.9%	0.32617	43.754	51.134	0.72
Winter ex-ante	0.535	58.7%	0.35324	44.544	49.928	0.64
Winter ex-post	0.452	52.1%	0.3808	4.8077	5.4218	0.67

The benzene ex-ante and ex-post winter surface concentrations that were estimated from GAM models are showed in Figure 14.

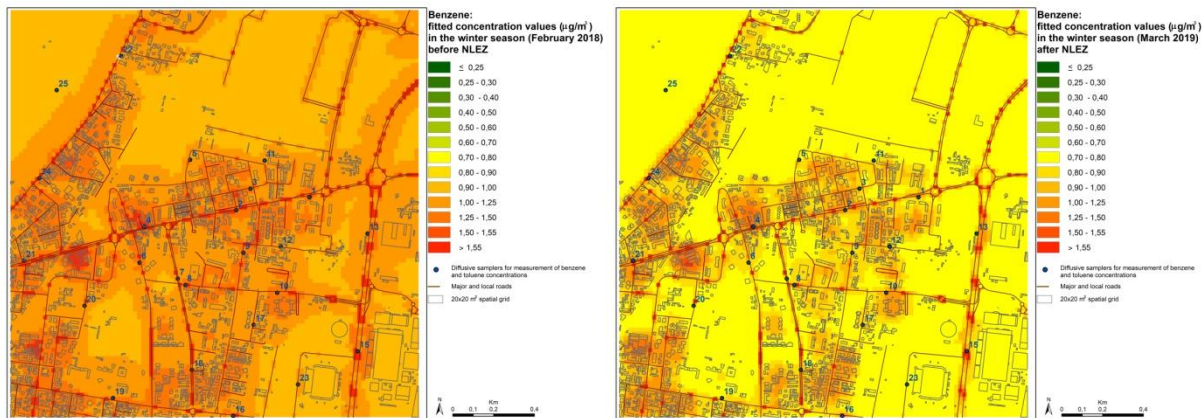


Figure 14. Benzene winter concentration levels ( $\mu\text{g}/\text{m}^3$ ) estimated from GAM models before (left) and after (right) NLEZ implementation.

## 4. Analysis of ante and post-operam monitoring results for Noise and Air Quality

### 4.1 Comparison between ante and post-operam results for noise

The interventions realised in Viale Libertà of the city of Monza (new low-noise pavement's laying and the limitation of the heavy vehicles passage for the means larger than 3,5 ton) provide very good results in terms of abatement of the traffic noise in the pilot area of LIFE Monza project.

In particular, in terms of noise monitoring with class I instrumentation, the reduction in terms of sound pressure levels measured in the “Day” period, between ante and post-operam, is equal to 2 dB. In the “Evening” and “Night” period this reduction is higher, until 6 dB in the night period.

The following considerations can be made in this respect:

- in the “Evening” and “Night” periods, when there are passages of only light vehicles and the traffic is fluid, there is a great result because the intervention of low-noise laying mainly works on the rolling noise;
- in the “Day” period, when there isn't fluid traffic with the presence of situations of “stop and go” due to a traffic light, the efficacy of the laying of road surface is lesser precisely because this kind of intervention principally works on the rolling noise.

Moreover, repeating the same analysis based on the low-cost sensor, it is possible to observe an excellent alignment between the noise levels' difference obtained between the two different measurement systems (Table 3).

After a comparison between the results obtained with instruments in class I and the Smart Noise Monitoring System (SNMS) it is possible to deduce that also the “low cost” monitoring sensors provide reliable data to evaluate the acoustic performance of interventions.

Results regarding traffic flows confirm that the attenuation observed in the graphic in Figure 5, in term of sound pressure level, is essentially due to the interventions realised.

In particular, a very good attenuation is obtained in the “Evening” and “Night” periods probably due to the presence, in these periods, of traffic flow moving in a fluid mode able to increase the performance of the low noise paving intervention.

### 4.2 Comparison between ante and post-operam results for air quality

In order to evaluate confounding factors related to the pollutants temporal pattern (drive by meteorology) and other possible difference due to contemporary city and region wide measures undertaken to tackle air pollution in 2019 (not already in force in 2017/2018), we compared the ex post vs ex ante averages calculated over all the monitoring campaigns and we cross checked the

differences found at monitoring stations inside the NLEZ and outside. Table 7 show the comparison carried out for NO<sub>2</sub>, PM<sub>10</sub> and BC.

		<b>MZ LIBERTA'</b>	<b>MZ MACHIAVELLI</b>
PM <sub>10</sub> – average (µg/m <sup>3</sup> )	Ex ante	<b>32</b>	<b>34</b>
	Ex post	<b>30</b>	<b>27</b>
	diff %	-18%	-19%
PM <sub>10</sub> - 90.4 percentile (µg/m <sup>3</sup> )	Ex ante	<b>59</b>	<b>63</b>
	Ex post	<b>51</b>	<b>57</b>
	diff %	-13%	-10%
NO <sub>2</sub> – average (µg/m <sup>3</sup> )	Ex ante	<b>41.0</b>	<b>41.2</b>
	Ex post	<b>37.2</b>	<b>43.5</b>
	diff %	-9%	5%
BC – average (µg/m <sup>3</sup> )	Ex ante	<b>3.80</b>	<b>2.92</b>
	Ex post	<b>2.75</b>	<b>1.98</b>
	diff %	-28%	-32%

Table 7. NO<sub>2</sub>, PM<sub>10</sub> and BC mean values over the ex-ante and ex-post sampling period. Percent different comparison among measurement carried out inside (MZ-Libertà) and outside (Mz-Machiavelli) the NLEZ.

For PM<sub>10</sub>, comparing annual averages, we found inside the noise LEZ (Viale della Libertà) values lower ex-post by 18% vs ex-ante.

The same happens outside Monza-Machiavelli (- 19%). Generally, considering other monitoring sites outside the LEZ, a consistent difference between ex-post and ex-ante was found, ranging between -27% and 3%. The ante-post opera ratio measured at Monza Libertà represents the 30th percentile in air quality network ratio distribution. (figure 15).

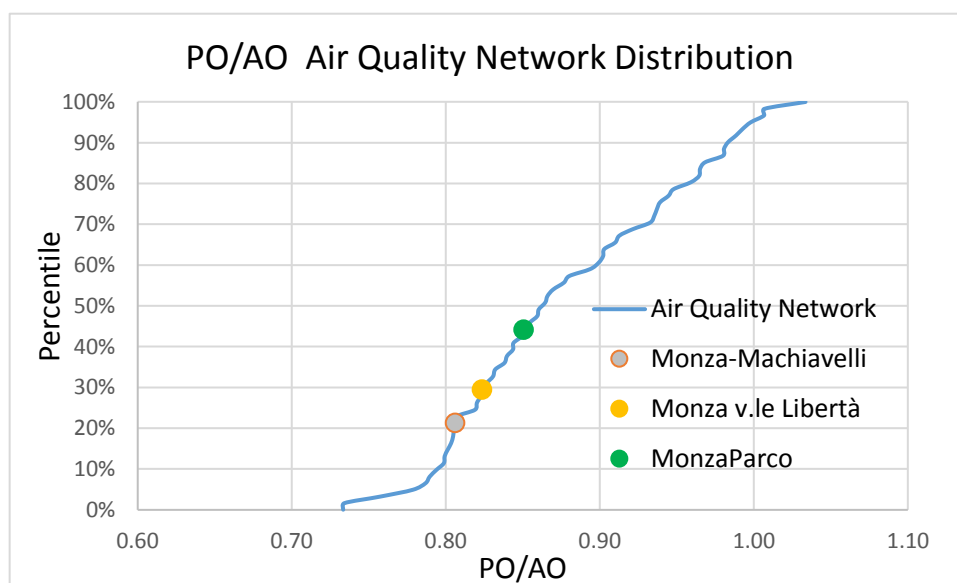


Figure 15. Ratio of the averages AO and PO measured



Thus, it would seem that there are not significant reduction effects for PM<sub>10</sub> mass concentrations attributable to the introduction of the NLEZ.

Similar figures can be detected from the comparison among percentiles (90.4 percentile, representing the occurrences of more than 36 daily mean over 50 µg/m<sup>3</sup>).

If we look at the NO<sub>2</sub> concentrations, it seems that the eventual effect due to the NLEZ alone was too little to be highlighted. Indeed, a small reduction (-9%) was observed inside the NLEZ while a small increase (+5%) was observed outside. However, the same happens comparing other stations outside the LEZ, that showed both small increase and little reduction, thus making ineffectual the attempt to remove the confounding factors.

The BC is of particular interest since previous studies have showed that focusing on specific “components” of PM, like black carbon, or parameter (e.g. particle number concentration) more related with exhaust vehicles emission, seems to be more suitable for assessing the impact of LEZs on local scale air quality [7], particularly when the LEZs involve traffic restriction for heavy duty diesel vehicles [8]. However in our case, the large reduction observed between ex post and ex ante monitoring campaigns seems to be largely due to confounding factors, since it was observed with the same order of magnitude both inside (-28%) and outside the NLEZ (-26%).

Assessing the microscale spatial variability of air pollution is still challenging. Models results are comforting in terms of the ability of the GAM model developed to describe the spatial variability of pollutants and to identify the variables that “explain” at least in part this variability.

In all cases, from the analysis of all the variables identified in the study, those with greater explanatory character were those related to the volume of the buildings in buffers with a radius of 75 and those related to the average daily traffic and the distance from the nearest road. This is a very satisfactory result which confirms the analysis of literature and which sees in the foreground as representative variables of the spatial pattern, in addition to traffic distribution, also some parameters indirectly linked to a potential “canyon effect” created by the presence of buildings in correspondence of local roads around a few meters from the measuring point.

## 5. Conclusion

In order to assess the environmental effects of a Noise Low Emission Zone, considering air quality conditions and environmental noise reduction, monitoring activities have been carried out in the Libertà district, the pilot area of the project, located in Monza.

Reduction of noise have been observed, in term of sound pressure levels , between ante and post-operam, and it is essentially due to the interventions realised. Positive effects can be detected during the day and particularly during the night period, probably due to the more fluid night traffic conditions. The comparison between the results obtained using Class I instruments and the Smart Noise Monitoring System (SNMS) highlights that also the “low cost” monitoring sensors provide reliable data, able to evaluate the effects of the interventions.

Noise monitoring and evaluation methods can be applied in other contexts, at different scales, being valid instruments, able to evaluate the NLEZ effects on noise decrease.

The effect of the NLEZ on air pollution seems to be negligible for combustion related pollutant and carbon fractions of PM, due both to the moderate spatial effects of the measures undertaken and confounding factors due to concomitant emission sources and meteorology.

To going deeper on this topic, statistical approach allowing to meteorologically normalise the pollutant concentrations time series are needed [22,23] but outside the scope of the present paper.

Monitoring with passive samplers has made possible to highlight the existence of a statistically significant spatial gradient on the microscale and its seasonal variability (the study domain is very small, only 4 km<sup>2</sup>).

The results are comforting in terms of the ability of the GAM models developed to describe reliably the spatial variability of traffic related pollutants and to identify the variables that "explain" at least in part this variability.

The monitoring and assessment strategy can be easily transposed to other small scale effectiveness studies aimed to evaluate the ancillary effects on air quality of NLEZ's implementation.

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