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## NO<sub>2</sub> concentration analysis in urban area of Catania

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### Abstract

The recent scientific researches have revealed principal causes and trend of Nitrogen dioxide (NO<sub>2</sub>), a chemical gas very dangerous for the human respiratory apparatus. The generation of this gas is principally associated to the high temperature combustion processes such as those in internal combustion engines and thermal power plants. In the urban area of Catania there are not thermal power plants so, the most important NO<sub>2</sub> generation is related to the increasing use of vehicles. It is also demonstrated that NO<sub>2</sub> is correlated with other pollutants such as PM<sub>10</sub> and PM<sub>2.5</sub>. The city of Catania is provided by an air quality monitoring network made up of five fixed stations. The principal monitored pollutants are: NO<sub>2</sub>, CO, BTX, PM<sub>10</sub>, O<sub>3</sub>, SO<sub>2</sub>. This paper focuses on the analysis of the big amount of NO<sub>2</sub> data recorded by instrument “Philips model 42” in the urban area of Catania. This data has been validated and analysed in order to conduct a multivariate statistical analysis. The Principal Component Analysis (PCA) and Cluster Analysis (CA), have been developed related to the atmospheric parameters (Wind velocity, Air Temperature, Precipitation, Relative humidity, Global Solar Radiation) in the period between 2009 and 2012. This multivariate analysis has been applied to the investigation process about the linear dependence of NO<sub>2</sub> to these parameters. Another important aim of this paper has been to study the trend of NO<sub>2</sub> concentration and the number of times this value has overtook the limits imposed by the Air Quality Directive 2008/50/EC.

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## 1. Introduction

In the mediterranean area the effect of climate changes is very dangerous for the human health. The anthropic impact is one of the most principal causes of air pollution. NO<sub>2</sub> (Nitrogen dioxide) is a typical gas that contributes to modify the standard air quality and climate [1]. Oxides of nitrogen (NO<sub>x</sub>) is the combination of nitric oxide (NO) and nitrogen dioxide (NO<sub>2</sub>). NO<sub>x</sub> is produced by fuel combustion processes occurring in the engine. NO is produced spontaneously in the human respiratory system, it is not harmful to health at the usual concentrations presented in the atmosphere. NO<sub>2</sub> instead, causes damages to health and environment. NO<sub>2</sub> is usually converted to nitric acid over a period of approximately 24 hours. It is removed from the atmosphere by two processes: direct deposition to the ground or in the form of acid rain. In a urban area with massive vehicles traffic and restricted dispersion of air pollutions, C<sub>NO2</sub> exceeds the allowed threshold. As reported by EEA 2012 annual report [2], 22 of the 27 EU Member States recorded exceedances of the limit value at one or more stations and people living close to traffic zones are much more exposed to high C<sub>NO2</sub> than those in urban background zones. The main causes of NO<sub>2</sub> and NO<sub>x</sub> are the emissions by vehicles, combustion of fuel in industry and power Plants. In the last years there was an increase of NO<sub>2</sub> emissions by vehicles due to the use of oxidative catalytic converters in diesel vehicles and the increased ratio of diesel vehicles as compared to petrol vehicles [3]. It is well-known that in urban zones a percentage of about 70-75 % of NO<sub>x</sub> emissions is usually related to vehicular sources. A focusing on physical and chemical fate of NO<sub>x</sub> released in the atmosphere from vehicles is reported in [4].

### Nomenclature

T	Air Temperature [°C]
P <sub>RC</sub>	Precipitation [mm]
H <sub>R</sub>	Relative Humidity [%]
R	Global Solar Radiation [MJ/m <sup>2</sup> ]
V <sub>w</sub>	Wind Velocity at [m/s]
C <sub>NO2</sub>	Concentration of Nitrogen Dioxide [µg/m <sup>3</sup> ]
M	Mean [-]
StD	Standard Deviation [-]
S%	Percentage of Samples [%]
N°	Number of Samples [-]
Md	Median [-]
A <sub>m</sub> C <sub>NO2</sub>	Annual Mean of concentration of Nitrogen Dioxide [µg/m <sup>3</sup> ]
Max	Maximum [µg/m <sup>3</sup> ]
V <sub>M%</sub>	Percentage of valid measurements [%]
E	Eigenvalue [-]
D <sub>EA</sub>	Euclidean Average Distance [-]
N° <sub>T200</sub>	Number of Times C <sub>NO2</sub> is greater than 200 µg/m <sup>3</sup> [-]

## 2. Area of study

The metropolitan area of Catania is about 180.88 km<sup>2</sup> with a density of 1600 pop/km<sup>2</sup> and a total population of 291274 according last studies by Italy's National Statistics Institute (ISTAT). Catania is populated especially in the northern part, while its southern part is mainly an industrial and commercial zone. It is one of the fifteen biggest metropolitan cities of Italy. It is characterized by a massive commuting toward the center of the city with a chaotic traffic caused especially by a disorganized urban development. The peak of the traffic is ranged between 07:00 and 09:30 while another important peak is concentrated in the late afternoon, and during summers even until 21:00. The climate is typically Mediterranean with high temperatures during the whole year (Average high Temperature up to 23/24 °C) and few precipitations with values usually between 450 mm and 550 mm per year.

### 3. Data sources

The air quality in Catania is monitored by Ecological Department of Municipality of Catania since 1992. The monitoring system is constituted by five stations. The pollutants recorded are: Nitrogen dioxide (NO<sub>2</sub>), Sulphur dioxide (SO<sub>2</sub>), Carbon monoxide (CO), Ozone (O<sub>3</sub>), Particulate matter (PM<sub>10</sub>), Benzene (C<sub>6</sub>H<sub>6</sub>). Four of these stations provide to measure C<sub>NO2</sub> hourly, and they are located in traffic (“Viale V. Veneto”), residential (“Piazza A. Moro” and “Librino”) and background sites (“Parco Gioeni”). NO<sub>2</sub> measurements are implemented by the instrument “Philips model 42” using the chemiluminescence principle. The period of study of this work was from 2009 and 2012.

Table 1. Characteristics and locations of stations.

Station	Description	Latitude/Longitude	Altitude (m)	Variable measured
Viale V. Veneto	Heavy traffic	37° 30' 83" / 15° 05' 26"	38	C <sub>NO2</sub>
Piazza A. Moro	Medium traffic	37° 31' 95" / 15° 05' 95"	76	C <sub>NO2</sub>
Librino	Light traffic	37° 29' 47" / 15° 02' 70"	71	C <sub>NO2</sub>
Parco Gioeni	Urban-background	37° 31' 44" / 15° 41' 99"	135	C <sub>NO2</sub>
Meteorological station	Industrial zone	37° 26' 36" / 15° 04' 7"	10	T, P <sub>RC</sub> , H <sub>R</sub> , R, V <sub>w</sub>

The meteorological data come from Sicilian agrometeorological information service (SIAS). The meteorological station is located at the industrial zone of Catania and is provided by the following instrumentations: an anemometer for V<sub>w</sub> (m/s) and its direction, a pyranometer for R (MJ/m<sup>2</sup>), a pluviometer for P<sub>RC</sub> (mm), a thermometer for T (°C) and a hygrometer for H<sub>R</sub> (%). All these instrumentations are installed at 2 m of altitude. In this work all data recorded were hourly. A brief description of these stations is in Table 1.

### 4. Methodology

A statistical analysis was chosen and applied in the present work. First of all, the big amount of data was analyzed and treated separately. Data from air quality monitoring systems stations needed to be validated and a great quantity of them were discarded because presented ambiguous values. Data from Meteorological station were treated as well but few samples were discarded. Once the two validations were performed, a database with all of them was build and each record consisted of meteorological variables and C<sub>NO2</sub> for the four stations of the Air quality monitoring system. A statistical analysis followed a scheme that can be summarized in three steps:

- A basic statistical analysis
- Principal Component Analysis (PCA)
- Cluster Analysis (CA)

#### 4.1. Basic statistical analysis

The data were analysed separately. The samples concerning C<sub>NO2</sub> were treated considering the four stations. Basic indices such as N°, M, Md, Max, V<sub>M%</sub> and N°<sub>T200</sub> were calculated to better understand C<sub>NO2</sub> trend. The same analysis was made for meteorological variables. C<sub>NO2</sub> was characterized respect both the four years and a division in diurnal hours (07:00/18:00) and nocturnal hours (19:00/06:00). It was also calculated the number of times C<sub>NO2</sub> overtook the limit imposed the Air Quality Directive 2008/50/EC. In order to better characterize the evolution of C<sub>NO2</sub>, EMMA index [5] was used. It was important to consider the reference temporal periods and values [5]. In order To better define the scale many reference standards [2] and C<sub>NO2</sub> trends of previous years were consulted. According to this index, 7 classes were defined in Table 2.

Table 2. Classes of  $C_{NO_2}$  according EMMA index.

Class	Limit
Good	$C_{NO_2} < C_{AM}$
Moderate	$C_{AM} < C_{NO_2} < C_{IV}$
Poor	$C_{IV} < C_{NO_2} < C_{AV}$
Critical	$C_{AV} < C_{NO_2} < C_{TV}$
Bad	$C_{TV} < C_{NO_2} < C_{LL}$
Severe	$C_{LL} < C_{NO_2} < C_{UL}$
Extreme	$C_{NO_2} > C_{UL}$

These classes were defined as follow:

- $C_{AM}$  represents the annual mean of  $C_{NO_2}$  concentration according European standards.
- $C_{TV}$  represents the current limit value imposed by the Directive 2008/50/EC.
- $C_{UL}$  represents the upper protection limit. It was set according European Standards.
- $C_{LL}$  represents the lower protection limit and was set as half the value of  $C_{UL}$ .
- $C_{IV}$  represents the intermediate value between  $C_{AM}$  and  $C_{TV}$ .
- $C_{AV}$  represents the alert concentration and was set equal more or less the 85% of  $C_{TV}$ .

#### 4.2. Multivariate Analysis

After the data were treated and analyzed separately, a multivariate analysis was used to relate meteorological patterns and  $C_{NO_2}$  in different stations and considering diurnal and nocturnal hours. First a PCA was conducted and results of it were used as support for a following CA. In previous studies, these two approaches were combined to explore significant information from the origin data for different air pollutants [6-8].

#### 4.3. Principal Components Analysis

PCA is a statistical technique that transforms the original set of inter-correlated variables into a new set of an equal number of independent uncorrelated variables or principal components that have linear combinations to the original variables. This technique was used to analyze the whole set of data composed by atmospheric variables and  $C_{NO_2}$ , normalizing them because of their different units of measurement. In order to have robust results, only principal components with E greater than 1 were considered because only these samples can be considered statistical significant [9]. For the same reason only linear correlation coefficients with absolute values greater than 0.50 were selected [10]. This analysis was useful to highlight principal components and to exclude variables that do not give a significant contribution to the set of data.

#### 4.4. Cluster Analysis

CA is used to group objects based on the similarity between them. In this study, a no-hierarchical agglomeration algorithm for clustering was applied. It was used K-means clustering of observations. This procedure uses non-hierarchical clustering of observations according to MacQueen's algorithm [11]. The variables were standardized in order to minimize the effect of scale differences because of their different units. K-means procedures work best when you provide good starting points for clusters [12] and for this reason the classification by EMMA index was used to initialize the clustering process. Only Clusters with a  $S\%$  greater than 20% and  $D_{EA}$  less than 1.3 were considered. StD, M and other parameters of each variable were considered to better understand the trend of these clusters.

## 5. Results and discussions

Table 3 shows basic statistical indices that were calculated considering the four air quality monitoring stations. Station “Librino” presents  $C_{NO_2}$  values lower than the others stations because it is placed in a zone with light traffic. Its values decreased from  $34.78 \mu\text{g}/\text{m}^3$  in 2009 up to  $16.07 \mu\text{g}/\text{m}^3$  in 2012. The station of “Viale V. Veneto” presents the highest values in terms of  $C_{NO_2}$  and the peak is  $70.11 \mu\text{g}/\text{m}^3$  in 2010. Concerning “Piazza A. Moro” station, it has to be mentioned that there were insufficient data in 2010 and 2011. “Parco Gioeni” station presents an important decrease of  $C_{NO_2}$  from  $74.97 \mu\text{g}/\text{m}^3$  in 2009 up to  $17.22 \mu\text{g}/\text{m}^3$  in 2012. According parameters imposed by the European Directive 2008/50/EC it was highlighted that all stations present for all the years a  $C_{NO_2}$  overtaking the limit of  $200 \mu\text{g}/\text{m}^3$  less times than 18 (number of allowed exceedances) with the exception of the station “Parco Gioeni” in 2009. It is also important to notice that the station “Parco Gioeni” never gets the minimum percentage of valid measurements imposed by the same law (70%).

Table 3. Basic statistical indices

		2009	2010	2011	2012
LIBRINO	N°	7626	5631	6875	7489
	$A_m C_{NO_2}$	34.78	28.56	16.72	16.06
	<i>Md</i>	31.22	22.46	11.96	10.77
	$N^\circ_{T200}$	0	0	0	0
	Max	128.75	176.93	122.24	119.03
	$V_{M\%}$	98.83	67.08	81.89	88.96
Parco GIOENI	N°	4315	\	3770	5176
	$A_m C_{NO_2}$	74.97	\	28.18	17.22
	<i>Md</i>	66.37	\	20.15	10.76
	$N^\circ_{T200}$	66	0	0	0
	Max	289.33	\	194.44	114.73
	$V_{M\%}$	51.4	\	44.91	61.49
Piazza A. MORO	N°	6331	\	\	7791
	$A_m C_{NO_2}$	37.41	\	\	34.44
	<i>Md</i>	28.35	\	\	28.03
	$N^\circ_{T200}$	1	0	0	0
	Max	210.41	\	\	177.75
	$V_{M\%}$	75.41	\	\	92.55
Viale V. VENETO	N°	6552	6389	8276	8147
	$A_m C_{NO_2}$	67.14	70.68	71.32	65.73
	<i>Md</i>	66.16	70.11	69.79	65.22
	$N^\circ_{T200}$	10	0	3	0
	Max	285.18	182.53	214.15	182.77
	$V_{M\%}$	78.04	76.1	98.58	96.78

According the use of the EMMA index, the frequency of occurrence of  $C_{NO_2}$  was calculated in respect to the reference years (Figures 1-4) and diurnal (Figure 5) and nocturnal hours (Figure 6). The trend of  $C_{NO_2}$  is almost the same with a most frequency of the Bad class both for years and hours. The station of “Viale V.Veneto” presents a frequency of occurrence of the Bad class very high, especially in the years 2011 (75%) and 2012 (79.7%). All stations present almost the same trend in diurnal hours and nocturnal hours. Even if it is supposed a drastic decrease of  $C_{NO_2}$  from diurnal hours to nocturnal hours, it does not happen in the urban area of Catania because of the intensive traffic during the late afternoon caused by the daily commute to home.

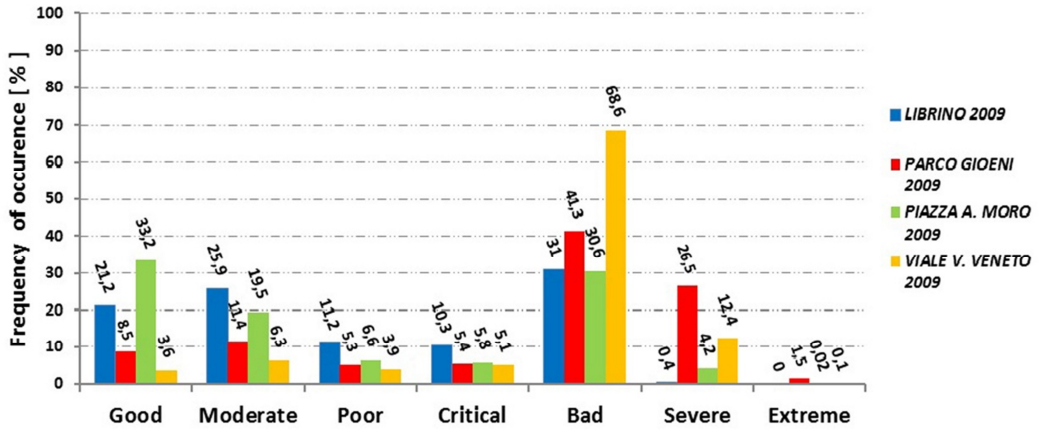


Fig 1. C<sub>NO2</sub> trend in the four stations in 2009.

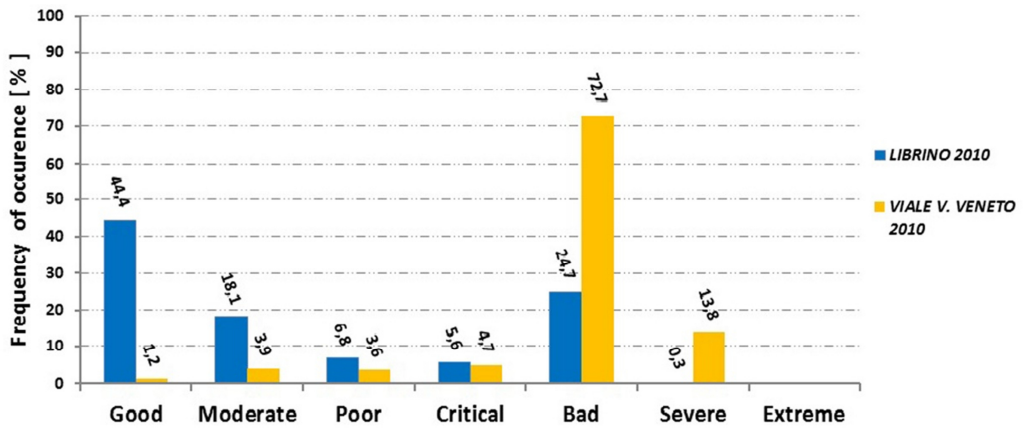


Fig 2. C<sub>NO2</sub> trend in the two stations in 2010.

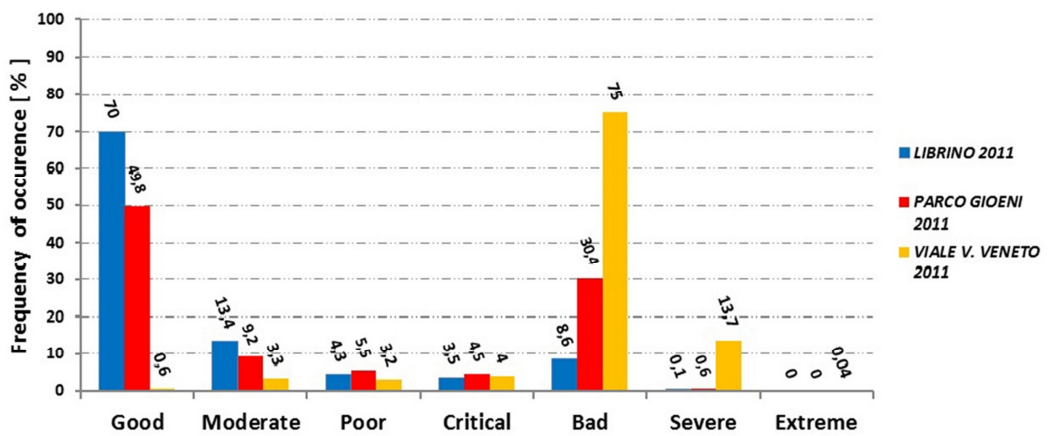


Fig 3. C<sub>NO2</sub> trend in the three stations in 2011.

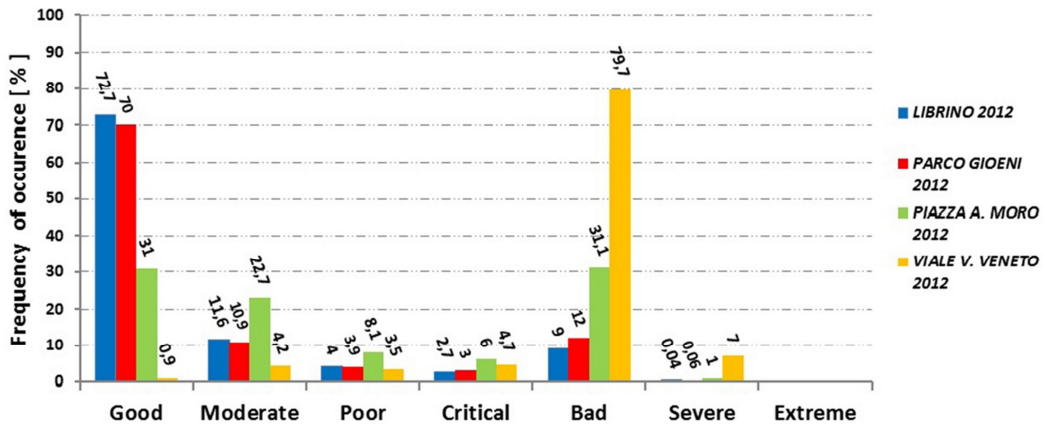


Fig 4. C<sub>NO2</sub> trend in the four stations in 2012.

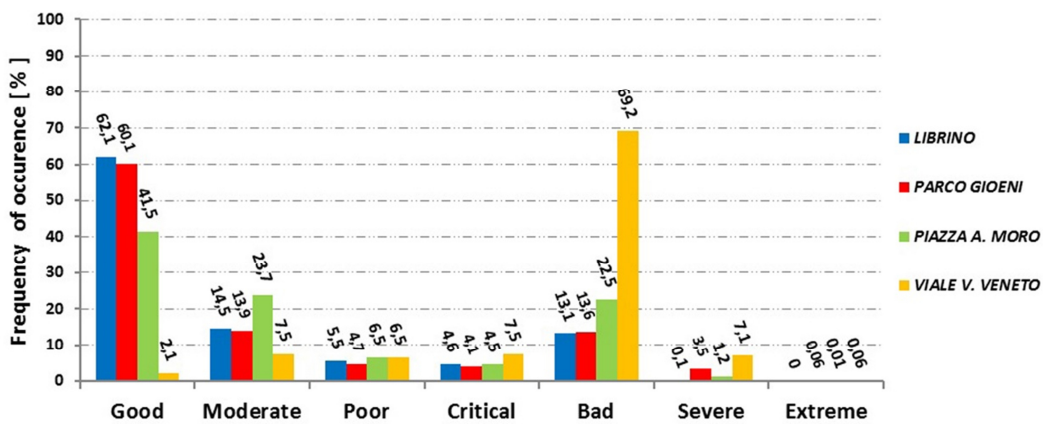


Fig 5. C<sub>NO2</sub> trend in the four stations during diurnal hours.

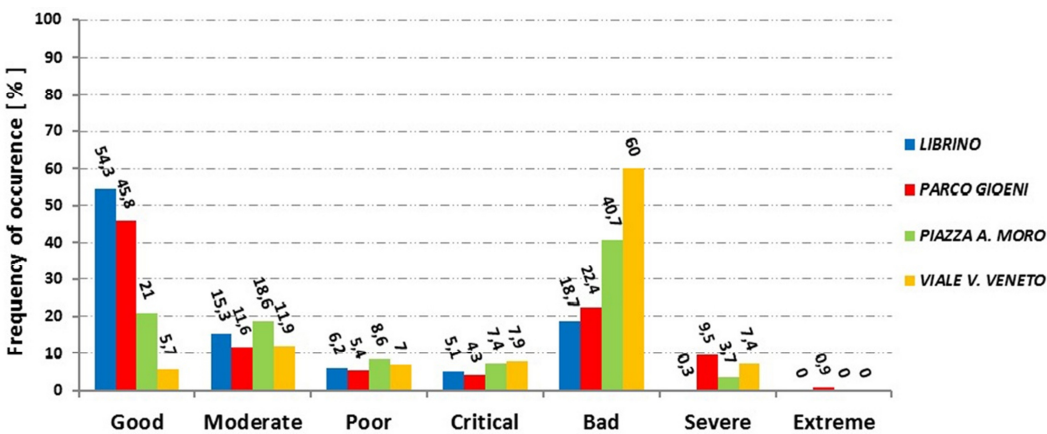


Fig 6. C<sub>NO2</sub> trend in the four stations during nocturnal hours.

PCA was made in order to relate atmospheric data from the meteorological station with  $C_{NO_2}$  of the four stations of the air quality monitoring system considering diurnal hours (Table 4) and nocturnal hours (Table 5). It is interesting how the first principal component is described almost ever by a strong correlation between T,  $H_R$  and R that characterize the typical Mediterranean climate. Moreover, it is shown that for both diurnal and nocturnal hours there is a strong linear dependence between  $V_w$  and  $C_{NO_2}$ . The  $P_{RC}$  do not seem to give any significant contribution to the study of this set of data. For this reason, it was decided to exclude  $P_{RC}$  in the CA.

Table 4. Main results of PCA at all stations for diurnal hours.

	Librino		Parco Gioeni		Viale V. Veneto		Piazza A. Moro	
	PC1	PC2	PC1	PC2	PC1	PC2	PC1	PC2
T	<b>0.50</b>	0.29	<b>0.51</b>	0.24	<b>0.52</b>	0.10	<b>0.50</b>	0.22
$P_{RC}$	-0.18	0.23	-0.25	0.04	-0.19	0.29	0.18	-0.28
$H_R$	<b>-0.56</b>	-0.05	<b>-0.55</b>	0.17	<b>-0.57</b>	0.06	<b>-0.56</b>	-0.11
R	<b>0.54</b>	0.15	<b>0.57</b>	0.03	<b>0.56</b>	0.01	<b>0.55</b>	0.10
$V_w$	0.31	<b>-0.60</b>	0.18	<b>-0.69</b>	0.25	<b>-0.63</b>	0.27	<b>-0.64</b>
$C_{NO_2}$	0.15	<b>0.70</b>	0.14	<b>0.66</b>	0.04	<b>0.71</b>	-0.16	<b>0.66</b>
E	2.29	1.30	2.18	1.33	2.26	1.19	2.25	1.21
Proportion	38.20%	21.60%	36.40%	22.20%	37.70%	19.90%	37.50%	20.30%
Cumulative	38.20%	59.80%	36.40%	58.60%	37.70%	57.60%	37.50%	57.80%

Table 5. Main results of PCA at all stations for nocturnal hours.

	Librino		Parco Gioeni		Viale V. Veneto		Piazza A. Moro	
	PC1	PC2	PC1	PC2	PC1	PC2	PC1	PC2
T	0.10	<b>0.66</b>	0.35	<b>0.52</b>	<b>0.62</b>	0.18	0.34	<b>-0.55</b>
$P_{RC}$	0.00	-0.28	-0.07	-0.25	-0.22	-0.17	0.01	0.40
$H_R$	<b>-0.56</b>	-0.39	0.32	<b>-0.66</b>	<b>-0.64</b>	0.29	<b>-0.66</b>	0.21
R	0.16	0.38	0.10	<b>0.47</b>	0.36	-0.15	0.27	0.28
$V_w$	<b>0.58</b>	-0.34	<b>-0.65</b>	0.13	0.00	<b>-0.72</b>	<b>0.49</b>	<b>0.54</b>
$C_{NO_2}$	<b>-0.56</b>	0.26	<b>0.58</b>	0.08	0.17	<b>0.56</b>	-0.36	-0.36
E	1.65	1.40	1.72	1.33	1.49	1.40	1.51	1.37
Proportion	27.40%	23.30%	28.70%	22.20%	24.80%	23.40%	25.00%	22.80%
Cumulative	27.40%	50.70%	28.70%	50.90%	24.80%	48.20%	25.00%	47.80%

Table 6 and Table 7 show the results obtained by CA. Obviously the R was not considered for nocturnal hours. As expected, from the inter-conversion of Ozone, NO and  $NO_2$  [13], there is a presence of high values of R and consequently high T, when there are low values of  $C_{NO_2}$  for all clusters in Table 6. There is also a strong relation between low values  $C_{NO_2}$  and high values of  $V_w$  and low values of H in clusters 1, 2, 3 and 4 (Table 6).



Table 6. Main results of CA at all stations for diurnal hours.

CLUSTER	T		H <sub>R</sub>		R		V <sub>w</sub>		C <sub>NO2</sub>			Station	
	M	StD	M	StD	M	StD	M	StD	M	StD	S <sub>%</sub>		D <sub>EA</sub>
1	27.70	4.03	46.14	11.42	2.57	0.51	2.07	0.58	10.25	8.71	23.00	1.26	Librino
2	29.25	2.89	43.84	10.85	2.62	0.53	2.00	0.64	21.99	9.92	23.72	1.16	Piazza A. Moro
3	27.66	3.58	49.17	10.36	2.57	0.51	2.14	0.57	44.02	15.19	22.53	1.23	Viale V. Veneto
4	27.75	2.95	46.50	10.16	2.56	0.57	1.84	0.55	24.03	16.22	19.83	1.18	Parco Gioeni

Table 7. Main results of CA at all stations for nocturnal hours.

CLUSTER	T		H <sub>R</sub>		V <sub>w</sub>		C <sub>NO2</sub>			Station	
	M	StD	M	StD	M	StD	M	StD	S <sub>%</sub>		D <sub>EA</sub>
5	25.59	2.97	75.92	6.58	0.70	0.43	18.21	11.87	29.93	1.08	Librino
6	20.27	3.43	83.21	7.02	0.42	0.39	32.12	14.59	24.29	1.07	Piazza A. Moro
7	10.32	3.43	83.76	7.25	1.03	0.47	43.06	15.85	26.66	1.14	Viale V. Veneto
8	19.64	3.30	81.76	6.30	0.56	0.41	33.04	22.70	20.69	1.05	Parco Gioeni

Figure 7 shows the prevailing Wind directions for the eight clusters. It shows as the typical direction of Wind for diurnal hours is North-East while for nocturnal hours is South-West.

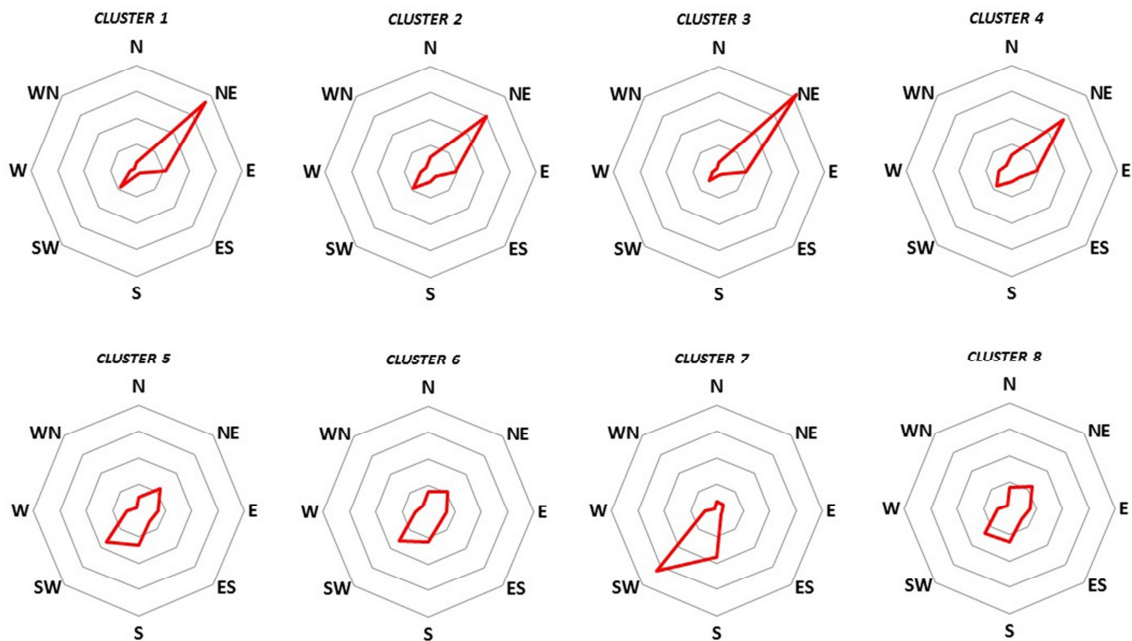


Fig 7. Prevailing Wind directions for the eight Clusters.

## 6. Conclusions

This work consists of a Statistical characterization of  $C_{NO_2}$  in Catania. Data come from the four stations of the air quality monitoring system presented in this metropolitan area. While “Librino” station and “Parco Gioeni” station present light traffic, “Piazza A. Moro” station and especially “Viale V. Veneto” are characterized by heavy traffic. None of them are provided by meteorological instruments, and for this reason meteorological data were acquired and treated from the meteorological station of SIAS in the industrial zone. As expected after first analysis the highest values of  $C_{NO_2}$  were found in the station of “Viale Veneto” while the station with the lowest values was “Librino”. After a basic statistical analysis a multivariate analysis was performed. This analysis showed that the lowest values of  $C_{NO_2}$  were found when high  $V_w$  and low  $H_R$  occurred, and during diurnal hours they were also related with high  $T$  and  $R$  values. This methodology allowed to find some linear correlations between these parameters, nevertheless, the monitoring air system of Catania should be provided by meteorological instruments for each station to describe more accurately these correlations.

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