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Spatial and temporal look at ten‑years air quality of Istanbul city

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Abstract

This study is aimed to investigate spatial and seasonal variations of air pollutants in Istanbul between 2007 and 2017. Target air pollutants were carbon monoxide, particulate matter, sulfur dioxide, nitrogen oxides, and ozone. Air quality data of the city of Istanbul were obtained from 31 continuous air quality monitoring stations located at the Anatolian and the European Sides of the city. Spatial and temporal variations of the air pollutants were assessed by statistical methods $(p<0.05)$. According to the results of this study, all air pollutants showed seasonal variations and all parameters were found to be higher during the heating periods than other periods $(p<0.05)$, except for ozone. The annual average values of carbon monoxide, particulate matter with diameter of less than 10 μ m, sulfur dioxide, ozone, and nitrogen dioxide (except for nitrogen dioxide levels measured in 2017) concentrations were below the national limit values in all stations between 2007 and 2017. In terms of yearly variation of the air pollutants, carbon monoxide and ozone showed statistically significant increasing trends $(p<0.001)$. Overall, once ten-years average air quality data were compared with current air quality limit values which was efective since 2019, PM and NO_2 may have limit exceedance problems in the next years. Moreover, levels of particulate matter with diameter of less than 2.5 µm were measured at 3 air quality monitoring stations, exceeded both World Health Organization and European Union limit values. Furthermore, positive correlations were found among the air pollutants ($p < 0.001$).

Keywords Air quality · Carbon monoxide · Istanbul · Nitrogen oxides · Ozone · Particulate matter · Sulfur dioxide

Abbreviations

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Introduction

Air pollution issue in Turkey was mostly observed during the winter due to domestic fuel consumption, in addition to the pollution from the exhaust emissions that is increasingly becoming a threat. Mostly, potential sources of air pollutants are roughly categorized as point, area, and line sources to estimate emission inventory of a region. Thermal power plants, oil refneries, high-capacity factories, and organized industrial zones are assumed to be the major point pollutant

sources. In addition, domestic heating for densely populated residential settings as area source, and roads due to traffic emissions are line sources (Altwicker et al. [1999](#page-11-0)). Nitrogen oxides (NOx), sulfur dioxide $(SO₂)$, particulate matter (PM), ozone (O_3) , and carbon monoxide (CO) are the typical urban air pollutants regulated in most of the countries worldwide.

Briefly, NOx is formed by the reaction of nitrogen (N_2) in the air with $O₂$ during high-temperature fuel combustion. $SO₂$ is produced when sulfur-containing fuels are burned or metals are extracted from sulfur-containing ore. In the US, about two-thirds of the emissions come from coal burning to generate electricity. CO is produced from incomplete combustion of fuels. In the US, more than half of the emissions consist of vehicles on the road. Although there is no direct source of tropospheric ozone, it is formed by a complex sequence of chemical reactions caused by sunlight. Particulate matter is not combinations of uniform compounds; some are acid, organic chemical, metal or soil. Some particles are formed by atmospheric reactions of gases such as in the case of SO_2 or NO_2 . Particles with a diameter of 10 µm and smaller are considered as PM_{10} , and particles with a diameter of 2.5 μ m and smaller are considered as PM_{2.5} (Mihelcic and Zimmerman [2010\)](#page-12-0).

Istanbul is the most crowded city of Turkey (population in 2019 is 15.519.267 people) and the most crowded 13th metropolitan city of the world (World City Populations [2020](#page-13-0)). Istanbul's urbanization rate is above the average of Turkey. Contribution to Turkey's economy with the service sector is huge due to extensive industry, fnance, trade, construction activities held in Istanbul. Istanbul is also in a central position in exports and imports and money markets are located here. In addition, Istanbul is an important city in terms of tourism (Ministry of Culture and Tourism [2019](#page-12-1)). In 2018, 13.4 million tourists visited to Istanbul, ranking the 8th most visited destination globally (Forbes [2019](#page-11-1)). Domestic heating, traffic (both road and marine traffics), and industry are the major components of the air pollution sources of Istanbul. Therefore, air quality of Istanbul city is crucial in terms of public health of the residents and the tourists visiting the city.

Earlier studies pointed out the importance of air pollution on Istanbul city as increase rate of population growth, rapid immigration, industrial activities without modern process control air pollution control measures, use of non-quali-fied fuel use, both road and marine traffic (Incecik [1986](#page-12-2); Bozyazi et al. [2000;](#page-11-2) Unal et al. [2000,](#page-12-3) [2011](#page-12-4); Sumen et al. [2005;](#page-12-5) Alkoy et al. [2009](#page-11-3); Elbir et al. [2010;](#page-11-4) Çapraz et al. [2016,](#page-11-5) [2017](#page-11-6); Baykara et al. [2019\)](#page-11-7). Due to population it serves, sustaining a good air quality in Istanbul is crucial in terms of public health concerns. In addition to source contributors of air pollutants measured in Istanbul city, health efects of air pollution were estimated in other studies (Issever et al. [2005](#page-12-6); Hapcioglu et al. [2006](#page-11-8); Alkoy et al. [2009](#page-11-3); Çapraz et al.

[2016](#page-11-5), [2017](#page-11-6); Onat et al. [2019\)](#page-12-7). Alkoy et al. ([2009](#page-11-3)) estimated the epidemiological aspects of Istanbul air quality between 1994 and 1998. Infuence of air pollution and meteorological parameters on respiratory diseases were investigated in two studies, covering data between 1997 and 2001 (Issever et al. [2005](#page-12-6); Hapcioglu et al. [2006](#page-11-8)): Strong to moderate negative associations were found for chronic obstructive pulmonary disease admissions and SO_2 , NO, CO, and PM₁₀, respectively (Hapcioglu et al. [2006\)](#page-11-8). Acute coronary syndrome was positively associated with SO_2 , CO, NO, and PM₁₀ levels (Issever et al. [2005\)](#page-12-6). The linkage between air pollution and mortality between 2007 and 2012 and they found that $SO₂$ as the largest relative risk factor for death (Çapraz et al. [2016](#page-11-5)). A study, considering the association between health problems and $PM_{2.5}$ and black carbon levels measured in Istanbul, found variable PM levels for diferent public transportation types (Onat et al. [2019\)](#page-12-7).

The aims of this study are to investigate (1) spatial, (2) seasonal, (3) yearly, (4) ten-years variations of air pollutants (CO, NO, NO₂, NOx, SO₂, O₃, PM_{2.5}, and PM₁₀) at all available air quality monitoring stations (AQMSs) in Istanbul between 2007 and 2017, (5) to estimate potential source contributors of the air pollutants, and (6) to determine the hot-spot locations that may have potential to exceed the national limit values of the air pollutants and require air quality improvement precautions in the near future.

Materials and methods

Study sites

Istanbul is the most crowded city of Turkey and currently 2904 people live in every km^2 of the city in terms of population density over the surface area. Population of Istanbul city was 12.573.836 in 2007 and 15.029.231 in 2017 (TÜİK [2018\)](#page-12-8). It should be pointed out here that some towns and districts of Istanbul city have been split or combined with another district(s) over the years due to some planning reasons. Therefore, population dynamics could not have been compared pairwise from 2007 to 2007. The most populated 5 districts were Ümraniye (897.260), Kadiköy (744.670), Üsküdar (582.666), Kartal (541.209), and Esenler (517.235) in 2007 and Esenyurt (846.492), Ümraniye (699.901), Üsküdar (533.570), Sultangazi (528.514), and Kartal (463.433) in 2017, respectively (TÜİK [2018\)](#page-12-8).

The air quality monitoring data used in the study were taken from the AQMSs of the national air quality monitoring network of the Ministry of Environment and Urbanization (MoE&U [2018\)](#page-12-9). The gathered data covered a tenyear period (2007–2017) as daily average. Measurements of some air pollutants started in between the study period and number of air pollutants measured at the AQMSs and/ or number of AQMSs were increased particularly in 2013 by MTHM. Two AQMSs at diferent parts of Kagithane, Kandilli, Üsküdar, and Ümraniye districts were available, either established by Istanbul Municipality (those statins are coded as—IB) or MTHM (those statins are coded as—M). The total number of AQMSs in Istanbul was 31, where 18 stations were located on the European side and 13 stations were located on the Anatolian side of the city. Figure [1](#page-4-0) shows the locations of the active air quality monitoring stations (AQMSs) in Istanbul throughout the study period. Of 31 AQMSs, PM_{10} and NO–NO₂–NO_x were measured in 28 stations, O_3 was measured in 24 stations, SO_2 was measured in 23 stations, CO was measured in 22 stations, and $PM_{2.5}$ was measured in 3 stations.

Air quality monitoring devices

As already mentioned, AQMSs of Istanbul were established frst either by Istanbul Metropolitan Municipality or Marmara Clean Air Center and therefore provided devices for each AQMS were not the same. Also, dates of frst establishment AQMSs and the further addition of air quality parameter(s) on the existing AQMSs were diferent for each station. Nevertheless, all devices that were established in all AQMSs over the study period were compatible with the internationally accepted corresponding standards and also calibration and maintenance was conducted on a regular basis (IBB [2020](#page-12-10)). All devices were monitoring the air quality continuously (24 h/7 days) and producing data as realtime. Time resolution of the measurements obtained by the instruments was 1 min. Brief explanations of the measurement techniques and the used measurement devices are as follows (more technical details can be found on the web sites of the corresponding instruments).

PM measurement devices (Enviorennement SA MP101M, Thermo 5014i, Metone Bam 1020, Environnement SA PM162M, MCZ LVS16, LECKEL SEQ 47/50, and MCV HVS1) were working according to the reference methods that were compatible with EN 12341 for PM_{10} and EN 14907 for $PM_{2.5}$, and all the measurement techniques used in all devices were approved by US EPA as Federal equivalent methods. O_3 measurement devices (Environnement 0341 M–O342M–O342e, Thermo 49i, and Teledyne T400) were working with UV absorption principle, and they were compatible with ISO 13964, 2008/50/EC, EN 14625, EN 15267, US-EPA 40 CFR, sections 53 and 58. CO measurement devices (Environnement SA CO12M–CO12e, Thermo 48i, and Teledyne T300) were working with IR absorption principle, compatible with ISO 4224, EN 14626, EN 15267, US-EPA 40 CFR sections 53 SUB B and SUB C, and approved by TUV. NOx measurement devices (Environnement SA AC32M–AC32e, Thermo 42i, and Teledyne T200) were working with chemiluminescence technology, compatible with ISO 7996, EN $14211: 2005$, and RoHS directive. SO₂ measurement devices (Environnement SA AF22M–AF22e, Thermo 43i, and Teledyne T100) are based on UV fuorescence measurement principle, compatible with ISO 10498, 2008/50/EC, EN 14212, EN 15267, and US-EPA 40 CFR sections 53 SUB B and SUB C.

All instrumentations used in the AQMSs were approved by TÜV. Calibration systems provided by MCZ Inc. (Germany) were used for regular calibration and required maintenance of the air quality monitoring devices (concentration adjustment, CMK5, CGM, catalytic gas treatment K15, NGM5, and Environics 6100 gas calibrator). Only calibrated and accurate measurement results that were shared publicly and were considered as a raw data. Afterward, all data gathered from the AQMSs were subjected to data evaluation stage before forming the fnal dataset that used in this study.

Data evaluation

Outlier detection and removing the incorrect measurement results were the main and time-consuming phase of the data evaluation to increase the data quality. Initially, measurement errors and "negative/zero" concentration data were eliminated from yearly data of each AQMS. For this aim, scatter plot and box-whisker plots were drawn for each annual air pollutant data of the AQMS concerned. After dealing with the outliers, 2.5–97.5% of the data set was assessed as the fnal form of the data set. Lastly, if fll factor of the air quality parameters at any station was over 50% for the year concerned, this data set was assumed to be appropriate for further statistical calculations. Thus, even though some air pollutants were measured at any of the stations, if the data quality of the year concerned did not ft the fll factor, this data set was not used in this study. Therefore, number of AQMS given in the previous section reduced after the data evaluation as given in Table [1](#page-4-1), showing how many AQMS data for the calculations were used. Spearman rank correlation was used due to the nonlinear data representation. ANOVA test showed the diferences among group means in a sample. For all applied tests, $p < 0.05$ was considered statistically signifcant. To estimate factors infuencing the ambient air quality of Istanbul city, the multivariate factor analysis with varimax rotation was applied to the whole data set. Monthly average levels of the air pollutants measured throughout the study period were input and the frst factor afected the air quality the most and the last factor afected the least as output of the factor analysis (Mentese et al. [2012,](#page-12-11) [2020a](#page-12-12), [b;](#page-12-13) Mentese and Akça [2020](#page-12-14)).

Fig. 1 Locations of air quality monitoring stations in Istanbul by ◂ 2017 stations on the **a** European side and **b** the Asian side (from left to right). (Locations 1: Silivri, 2: Esenyurt, 3: Avcilar, 4: Yenibosna, 5: Şirinevler, 6: Esenler, 7: Başakşehir, 8: Sultangazi, 9: Alibeyköy, 10: Aksaray, 11: Çatladikapi, 12: Kagithane-M, 13: Kagithane-IB, 14: Maslak, 15: Mecidiyeköy, 16: Beşiktaş, 17: Sariyer, 18: Kumköy, 19: Kandilli-M, 20: Kandilli-IB, 21: Üskudar-M, 22: Üskudar-IB, 23: Selimiye-Üsküdar, 24: Kadiköy, 25: Göztepe, 26: Ümraniye-M, 27: Sultanbeyli, 28: Kartal, 29: Büyükada, 30: Şile, 31: Ümraniye-IB)

Results and discussion

General view of Istanbul air quality

Average values of temperature and relative humidity throughout the study period were $15. \pm 7.1$ °C and $79 \pm 13.2\%$, respectively. Descriptive statistics for the measured air quality parameters of Istanbul between 2007 and 2017 are given in Table [1](#page-4-1). Number of AQMSs were increased by MTHM as from 2013. NOx and ozone were measured at the maximum number of stations $(n=21)$, whereas $PM_{2.5}$ was measured at only 3 AQM stations as from 2017. Ten-years average levels of CO, $PM_{2.5}$, PM_{10} , SO_2 , NO, NO₂, NOx, and ozone from 2007 to 2017 were

Table 1 Descriptive statistics for the air quality of Istanbul citya

851, 27, 53, 9, 51, 63, 122, and 34 μ g/m³, respectively. No national limit value exceedance was observed for all parameters as a city average, except that annual average $NO₂$ level over the year of 2017. On the other hand, NOx limit value (30 μ g/m³) set in HKDYY effective as from 2014 to protect the vegetation was exceeded from 2014 to 2017 (HKDYY [2008](#page-11-9)).

CO levels

As can be seen from Table [1,](#page-4-1) the highest annual average CO level was observed recently, in 2017 (1497 μ g/m³), whereas the lowest annual average CO level was observed in 2008 $(618 \mu g/m³)$. Once all AQMSs data were considered over the study period to take a picture of CO levels occurred in Istanbul, it was seen that CO levels risen over the years $(p<0.001)$, indicating increasing the contributions of CO sources in the air. Figure [2](#page-5-0)a shows the spatial variation of CO concentrations throughout the study period. The highest CO levels were observed in Selimiye, Kagithane-IB, and Çatladikapi stations with a median CO level of>1500 µg/ $m³$, while median CO levels were below 1000 μ g/m³ at the remaining AQMSs. The CO concentrations measured in Selimiye station varied in a very wide range (450–5150 µg/

aData were presented as arithmetic mean±standard deviation of 2.5–97.5% of the stations' annual average concentrations (number of station; available HKDYY limit value at the year concerned) in the table. ^b8-h average limit value. CNO limit value is set to protect the vegetation. Yearly average values that exceeded the HKDYY limit value of the year concerned are shown bold. *NA*: Not available

Fig. 2 CO concentrations (μ g/m³) measured **a** at AQMSs of Istanbul $(p<0.001)$ and **b** monthly variation between 2007 and 2017 $(p<0.001)$. (*Note*: designations of the boxes: \equiv 25–75%, \vdash and \vdash : lower and upper confdence levels within 1.5 inter quartile range (IQR) , : median line, and +: arithmetic mean)

Fig. 3 a PM₁₀ ($p < 0001$) and **b** PM_{2.5} ($p < 0.001$) concentrations (μ g/ m³) measured at AQMSs of Istanbul between 2007 and 2017

m³). According to ANOVA test, CO levels showed a statistically significant difference among the AQMSs $(p < 0.001)$. In terms of yearly CO variation at each AQMS, Yenibosna, and Başakşehir stations had increasing trend, whereas Alibeyköy, Esenler, and Üsküdar-IB stations had decreasing trend over the years $(p < 0.05)$. Furthermore, monthly variation of CO levels measured at all AQMSs throughout the study period is shown in Fig. [2b](#page-5-0). Even though several extremely high CO levels up to 7000 μ g/m³ were seen,

Fig. 4 Monthly variations of **a** PM_{10} ($p < 0001$) and **b** $PM_{2.5}$ $(p<0.001)$ concentrations (μ g/m³) measured at all AQMSs of Istanbul between 2007 and 2017

Fig. 5 SO_2 concentrations (μ g/m³) measured **a** at AQMSs of Istanbul $(p<0.001)$ and **b** monthly variation between 2007 and 2017 $(p < 0.001)$

to visualize monthly change of CO levels better, the concentration scale was shown up to $2500 \mu g/m^3$ in Fig. [2b](#page-5-0). Accordingly, the highest CO levels were seen during the winter (med CO level was approx. $850 \mu g/m^3$), whereas the lowest CO levels were seen during the summer (med CO level was approx. 500 μ g/m³). According to ANOVA test, CO levels showed a statistically signifcant monthly diference, based on monthly average CO levels data, covering

all AQMSs ($p < 0.001$). Both CO limit values set by Turkish Ministry (in HKDYY: 10 mg/m³ as 8-h average) and United States Environmental Protection Agency (US EPA, 2020) (9 ppm = 10.3 mg/m³) were not exceeded at any of the AQMS.

PM levels

According to Table [1,](#page-4-1) the highest annual average PM_{10} level was observed in 2007 (avg: $67 \mu g/m^3$), whereas the lowest annual average PM_{10} level was observed in 2017 (46 μ g/m³). It was seen that PM_{10} levels decreased over the years, once all AQMS data were considered over the study period and were negatively correlated with year $(p < 0.001)$, indicating the source contributors of PM_{10} in the air were lowered. Figure [3](#page-5-1)a shows the spatial variation of PM_{10} throughout the study period. The highest PM_{10} level was observed in Esenyurt (median PM_{10} level was approx. 100 $\mu\text{g/m}^3$), which is the most crowded district of the city with a population of 846,492 people in 2017, while the lowest PM levels were seen in Şile (median PM_{10} level is approx. 30 $\mu g/m^3$), which was a rural touristic place occupied regularly with less people with a population of 35,131 people in 2017 (TÜİK [2018](#page-12-8)). According to ANOVA test, PM_{10} levels showed a statistically significant difference among the AQMSs $(p < 0.001)$. In terms of PM₁₀ variation at each AQMS over the years, Beşiktaş, Esenler, Kartal, Üsküdar-IB, Şile, Şirinevler, Ümraniye-M, and Üskudar-M stations showed yearly decreasing trend $(p < 0.05)$, while no significant increasing trend of PM_{10} was seen at the remaining AQMSs. Furthermore, monthly variation of PM_{10} levels measured at all AQMSs throughout the study period is shown in Fig. [4](#page-5-2)a. PM_{10} levels were slightly higher during the heating season (med PM₁₀ level was approx. 60–65 μ g/m³) than the summer months (med PM_{10} level was approx. 50 μ g/m³). According to ANOVA test, PM_{10} levels showed a statistically significant monthly difference $(p < 0.001)$. The fact that national PM_{10} limit values given in HKDYY were not constant for the study period (i.e., annual average PM_{10} limit value decreased in 2007 from 150 to 48 μ g/m³ in 2017), the annual average values were compared with the limit value of the year concerned (see Table [1](#page-4-1) for HKDYY limit values), and annual PM_{10} limit values were not exceeded during the study period. On the other hand, the annual average PM_{10} values measured at all stations exceeded the current annual average PM_{10} limit value of 40 μ g/m³, which has been effective in HKDYY since 2019.

 $PM_{2.5}$ has been measured since 2013 only at 3 AQMSs, which are Kagithane-M, Ümraniye-M, and Silivri AQMSs. As can be seen from Table [1](#page-4-1), the highest annual average $PM_{2.5}$ level was observed in 2013 (30 μ g/m³), whereas the lowest annual average $PM_{2.5}$ level was observed in 2016 ($23 \mu g/m³$). Once data of all 3 AQMSs were considered over the study period, decrease in $PM_{2.5}$ levels was found over the years $(p < 0.05)$, indicating the reduction of the source contributors of $PM_{2.5}$ emitted in the air. Figure [3b](#page-5-1) shows the spatial variation of $PM_{2.5}$ throughout the study period. The highest $PM_{2.5}$ levels were observed in Kagithane-M, Ümraniye-M, and Silivri stations, in descending order. Also, $PM_{2.5}$ concentration measured in Kagithane-M station varied in a very wide range (15–64 μ g/m³). PM_{2.5} levels showed a statistically signifcant diference among the AQMSs ($p < 0.001$). In terms of yearly PM_{2.5} variations at each AQMS, merely Ümraniye-M station showed a decreasing trend over the years ($p < 0.05$), while no signifcant yearly variation was seen in both Kagithane-M and Silivri stations ($p < 0.05$). Furthermore, monthly variation of $PM_{2.5}$ levels measured at all 3 AQMSs throughout the study period is shown in Fig. [4b](#page-5-2), indicating higher $PM_{2.5}$ levels occurrence during heating season (med $PM_{2.5}$ level was approx. > 30 μ g/m³) and lower PM_{2.5} levels occurred during the summer months (med $PM_{2.5}$ level was approx. 20 µg/ m^3). According to ANOVA test, PM_{2.5} levels measured at all AQMSs showed a statistically signifcant monthly diference $(p < 0.001)$. The fact that no limit value has been set for ambient $PM_{2.5}$ levels on a national basis, annual $PM_{2.5}$ limit values stated by European Union (EU 2016) (25 μ g/m³) and World Health Organization $(10 \,\mu\text{g/m}^3)$ (WHO, [2018](#page-13-2)) can be used just for making a comparison with the measured $PM_{2.5}$ levels. Accordingly, annual average $PM_{2.5}$ levels measured at 3 stations exceeded the WHO limit in each year, while they were below or slightly higher than EU's PM_2 , annual limit value. Finally, there is an urgent need to increase the number of stations for $PM_{2.5}$ measurements in Istanbul city, particularly at the districts where air quality can be infuenced by traffic and other combustion emission sources. Ambient PM_{2.5} levels were found to be as high as $>120 \mu g$ / $m³$ in Palestine (Jodeh et al. [2020](#page-12-15)).

SO2 levels

According to Table [1,](#page-4-1) the highest annual average $SO₂$ level was observed in 2016 (20 μ g/m³), whereas the lowest annual average SO_2 level was observed in 2010 and 2014 (6 μ g/m³). Once all AQMS data were considered over the study period, SO₂ levels showed no significant change by year ($p > 0.05$), indicating stable source contributors of SO_2 in the air over the years. Figure [5](#page-5-3)a shows the spatial variation of SO_2 levels throughout the study period. The $SO₂$ levels were mostly lower than 15 μ g/m³ at the AQMSs and the highest SO₂ levels were observed in Kagithane-IB and Kandilli-M stations. Also, the $SO₂$ concentrations measured in the Kagithane-IB station varied in a very wide range (range: $35 \mu g/m^3$). SO_2 levels showed a statistically signifcant diference among the AQMSs ($p < 0.001$). In terms of yearly SO₂ concentrations at each AQMS, Sariyer, Başakşehir, Kagithane-M, Kandilli-M,

Şile, Şirinevler, and Ümraniye-M stations showed increasing trends, while Beşiktaş, Esenler, Kartal, Kagithane IB, Yenibosna, Üsküdar-IB, and Sultangazi stations showed decreasing trend over the years $(p < 0.05)$. Furthermore, monthly variation of SO₂ levels measured at all AQMSs throughout the study period is shown in Fig. [5b](#page-5-3). Even though several extreme SO_2 levels up to 70 μ g/m³ were seen, the highest $SO₂$ levels occurred during the heating season, whereas the lowest $SO₂$ levels occurred during the summer, as expected. $SO₂$ levels showed a statistically significant monthly difference, based on monthly average SO_2 levels data of all AQMSs ($p < 0.001$). The fact that national SO₂ limit values given in HKDYY were not constant for the study period (i.e., annual average $SO₂$ limit value decreased in 2007 from 60 to 20 μ g/m³ in 2017), the annual average values were compared with the limit value of the year concerned (see Table [1](#page-4-1) for HKDYY limit values) and annual $SO₂$ limit values were not exceeded during the study period.

NO, NO2, and NOx levels

As shown in Table [1,](#page-4-1) the highest annual average NO level was observed recently in 2017 (61 μ g/m³), whereas the lowest annual average NO level was observed in 2007 and 2012 $(42 \mu g/m³)$. Once all AQMS data were considered over the study period, NO levels showed no signifcant change over the years $(p > 0.05)$. NO levels showed a statistically significant difference among the AQMSs $(p < 0.001)$. In terms of yearly NO variation at each AQMS, Aksaray, Beşiktaş, Ümraniye-IB, and Kagithane-M stations showed increasing trends $(p < 0.05)$, while NO levels did not decrease at the

Fig. 6 Monthly variations of **a** NO ($p < 0.001$), **b** NO₂ ($p < 0.001$), and **c** NOx ($p > 0.5$) concentrations (μ g/m³) measured at all AQMSs of Istanbul between 2017

remaining stations $(p > 0.05)$. Furthermore, monthly variation of NO levels measured at all AQMSs throughout the study period is shown in Fig. [6a](#page-7-0). The highest NO levels were seen during the heating season (med NO level was approx. $80 \mu g/m³$), whereas the lowest NO levels were seen during the summer (med NO level was approx. $<$ 50 μ g/m³). NO levels showed a statistically signifcant monthly diference, based on monthly average NO levels data of all AQMSs $(p < 0.001)$.

According to Table [1,](#page-4-1) the highest annual average $NO₂$ level was observed in 2009–2010 (74 μ g/m³), whereas the lowest annual average $NO₂$ level was observed in 2007 $(45 \mu g/m³)$. Once all AQMS data were considered over the study period, $NO₂$ levels showed a decreasing trend over the years ($p < 0.001$). NO₂ levels showed a statistically significant difference among the AQMSs $(p < 0.001)$. In terms of yearly NO₂ variation at each AQMS, Beşiktaş, Çatladikapi, Kagithane-IB, and Ümraniye-IB stations showed increasing trends (*p*<0.05), while Esenyurt-M, Mecidiyeköy, Sultangazi, and Ümraniye-M showed decreasing trend over the years ($p < 0.05$). Furthermore, monthly variation of NO₂ levels measured at all AQMSs throughout the study period is shown in Fig. $6b$. NO₂ levels were lower in the summer months than rest of the year and $NO₂$ levels showed a statistically significant monthly difference $(p < 0.001)$. According to $NO₂$ limit values set in $HKDYY$ for each study year, no limit exceedances were observed throughout the study period (i.e., $NO₂$ limit value was lowered in 2007 from 100 to 54 μ g/m³ in 2017). However, currently effective NO₂ limit value of 40 μ g/m³ set in HKDYY would have been exceeded.

As given in Table [1](#page-4-1), the highest annual average NOx level was observed in 2013 (138 μ g/m³), whereas the lowest annual average NOx level was observed in 2007 (86 μ g/m³). Once all AQMS data were considered over the study period, NOx levels showed no signifcant change over the years $(p > 0.05)$, indicating constant source contributors of NOx in the air over the years. Figure [7](#page-7-1) shows the spatial variation of NOx levels throughout the study period. The highest NOx levels were observed in Aksaray and Beşiktaş. Also, the NOx concentration measured in

Fig. 7 NOx concentrations $(\mu g/m^3)$ measured at AQMSs of Istanbul between 2007 and 2017 ($p > 0.05$)

Ümraniye-M station varied in a very wide range. NOx levels showed no statistically signifcant diference among the AQMSs (*p*>0.05). Moreover, in terms of yearly NOx variation at each AQMS, Aksaray, Alibeyköy, Beşiktaş, Esenler, Başakşehir, Esenyurt-M, and Ümraniye-M stations had increasing trends $(p < 0.05)$, while Mecidiyeköy and Sultangazi had decreasing trends over the years $(p < 0.05)$. Furthermore, monthly variation of NOx levels measured at all AQMSs throughout the study period is shown in Fig. [6](#page-7-0)c. Even though the highest NOx levels were observed during the heating season and the lowest NOx levels were observed during the summer months. NOx levels showed no statistically signifcant monthly diference, based on monthly average $NO₂$ levels data of all AQMSs ($p > 0.05$).

Fig. 8 Ozone concentrations $(\mu g/m^3)$ measured **a** at AQMSs of Istanbul $p < 0.001$) and **b** monthly variation ($p > 0.05$) between 2007 and 2017

O3 levels

According to Table [1](#page-4-1), the highest annual average ozone level was observed in 2013 (48 μ g/m³), whereas the lowest annual average ozone level was observed in 2007 $(24 \mu g/m³)$. Ozone levels measured at all AQMS data rose over the study period were positively correlated with year $(p < 0.001)$, indicating the increment of ozone source contributors in the air. As shown in Fig. [8a](#page-8-0), ozone levels showed statistically signifcant diference among the AQMSs ($p < 0.001$). The highest ozone levels were observed in Ümraniye-M, Kandilli-M, Üsküdar-M, and Şirinevler stations with median ozone level of> 900 µg/ $m³$, while median ozone levels were below 100 μ g/m³ at the remaining AQMSs. In terms of yearly variation of ozone level at each AQMS, increasing trends were seen at Aksaray, Alibeyköy, Kandilli-M, Ümraniye-M, and Üsküdar-M, while decreasing trends were observed at Beşiktaş, Esenyurt, Sultanbeyli, and Şile stations over the years $(p < 0.05)$. Furthermore, monthly variation of ozone levels measured at all AQMSs throughout the study period is shown in Fig. [8b](#page-8-0). Even though several extreme ozone values up to > 500 μ g/m³ were seen, the concentration scale was shown up to 500 μ g/m³, to visualize monthly change better. Although ozone levels started to increase with spring and decreasing trend started with the fall season and varied in a very wide range over the months, monthly variation of ozone levels was not significant ($p > 0.05$). Earlier studies have already shown that there is a positive correlation between ozone levels and temperature (Zhang et al. [2015](#page-13-3); Rao and Zurbenko [1994](#page-12-16)). A study conducted in Istanbul between 2007 and 2009 found minimum ozone levels during the winter period (Im et al. 2013). Since national limit value of 120 μ g/m³ for an annual average ozone concentration is available 8-h average ozone limit value set by both Turkish Ministry and EU can be used for comparison and average ozone levels did not exceed this value at any of the AQMS.

Table 2 Correlations across the monthly average air pollutant level pairs for all AQMSs data

Parameter	_{CO}	NO.	NO ₂	NOx	O ₃	PM_{10}	$PM_{2.5}$	SO ₂
CO								
NO.	$0.25**$ (682)							
NO ₂	0.03(726)	$0.55**$ (1069)						
NO x	0.01(683)	$0.07*(1056)$	0.05(1069)					
O_3	$-0.14(337)^{*}$	$0.16**$ (610)	$0.22**$ (848)	$0.16**$ (609)				
PM_{10}	$0.16**$ (936)	$0.21**$ (926)	$0.10**$ (1123)	0.01(933)	0.01(669)			
$PM_{2.5}$	NA	$0.52**$ (81)	$0.40**$ (146)	$0.31*(85)$	0.09(145)	$0.81**$ (97)		
SO ₂	$0.17**$ (780)	$0.10*(825)$	$0.09*(1015)$	0.05(824)	$0.18**$ (614)	$0.10**$ (1316)	$-0.04(97)$	

Data in the table is presented as correlation coefficient (n); correlation coefficient of > 0.50 are shown bold. * $p < 0.05$ and ** $p < 0.001$ show signifcantly correlated pairs. *NA*: not available

Associations between the air pollutants and potential source contributors

Table [2](#page-8-1) shows correlations between the measured air pollutants levels at all AQMSs throughout the study period. Strong correlations ($p < 0.001$) were found between PM₁₀ and PM_{2.5} $(r=0.81)$, between NO and NO₂ ($r=0.55$), between NO and PM_{2.5} ($r = 0.52$), and between NO₂ and PM_{2.5} ($r = 0.40$). Also, moderate to weak correlations were found between several air pollutants ($p < 0.05$), such as NOx and PM_{2.5}, CO and NO, NO_2 and O_3 , and NO and PM₁₀.

Table [3](#page-9-0) shows factor analysis results for Istanbul city ambient air quality. Factor loadings and variance apportionments obtained by factor analysis with varimax rotation for components of ambient air quality is presented. $PM_{2.5}$ and NOx levels are discarded from the dataset to be applied factor analysis. Since PM_2 , has been measured merely at three AQMSs, number of pairwise data would be low. Levels of NO and $NO₂$ are used to explain nitrogen oxides sources. Based on the results of the factor analysis, 3 factors were identifed, impacting the ambient air quality of Istanbul. The first factor $(F1)$ was originated from traffic sources. $F1$ included high loadings of $NO₂$ and NO as well as moderate loading of ozone, indicating that this factor had contribution of traffic-related human activities (Beelen et al. [2013\)](#page-11-11). The second factor (F2) was defned as combustion from mixed sources. F2 included high loading of CO and moderate loadings of PM_{10} , SO_2 , and NO. As already known, CO as the major source contributor of the second factor in an incomplete combustion product. Major sources of combustion in Istanbul are traffic, industry, and domestic heating with solid fuel. Besides, PM_{10} contribution together with CO presence in the same factor support this conclusion as PM_{10} might have originated from the same source contributor(s). The third factor (F3) was identifed as heating and ozone accumulation, including high loadings of $SO₂$ and ozone levels. According to Istanbul city report published in 2015, solid fuel (coal including 0.9–2.0% Sulfur) and fuel oil provided as bunker fuel (majority of supplied fuel oil $>1\%$ Sulfur) have been used in residential and industrial settings, in addition to natural gas consumption (MoE&U [2015](#page-12-18)). As already known, Bosphorus strait splitting the city to European and Asian part is one of the busiest sea ways of the world with on average 50 000 transit ships passages (Ministry of Transport [2018](#page-12-19)). Turkey plays an important strategic role in maritime transport since the country is surrounded on three sides by the sea and located between Asia and Europe. Therefore, air pollution from ships is one of the major issues for Turkey. Previous studies showed the contribution of maritime transport on levels of air pollutants such as PM , SO_2 , NOx , and hydrocarbon emissions (Mentese and Akça [2020](#page-12-14); Kılıç and Deniz [2010;](#page-12-20) Alver et al. [2018](#page-11-12)).

In a study conducted in Istanbul, fve source components for PM were identified: traffic, road dust, industry, and coal and gasoline combustion and industrial (Onat et al. [2012](#page-12-21)). Another study, considering ozone, BTEX, $NO₂$, and $SO₂$ levels at 10 diferent urban points of Istanbul urban area between 2011 and 2012 found more source contributors (industrial and traffic related) other than a single source (Ercan et al. [2019\)](#page-11-13).

Previous studies, starting from 90's up to now have indicated that the importance of air pollution issue for Istanbul city is still of concern in terms of public health (Saral [2011](#page-12-22); Ozcan [2012;](#page-12-23) Unal et al. [2011](#page-12-4); Kocak et al. [2011](#page-12-24); Toros et al. [2013;](#page-12-25) Yurtseven et al. [2018;](#page-13-4) Elbir et al. [2010;](#page-11-4) Ercan et al. [2019;](#page-11-13) Gokce et al. [2020;](#page-11-14) Flores et al. [2017](#page-11-15), [2020;](#page-11-16) Onat et al., [2019;](#page-12-7) Im et al. [2013](#page-12-17); Ozdemir et al. [2014;](#page-12-26) Baykara et al. [2019;](#page-11-7) Ercan et al. [2019;](#page-11-13) Sahin et al. [2020\)](#page-12-27). In the 1990s, high values for SO_2 and PM values were seen with the use of coal, and currently, low-quality fuel use in residential areas, industrial emissions, and vehicle emissions was shown as the causes of air pollution in Istanbul (Saral [2011](#page-12-22)). Anthropogenic air pollution emissions in Istanbul from residential combustion, solvent use, industry, fuel distribution, road and maritime transport, waste, and energy were evaluated together with other megacities in the Eastern Mediterranean and regional and long range air pollution transport found to have an importance in these cities (Kanakidou et al. [2011](#page-12-28)). Another study considered the maximum concentration values of $SO₂$ and $NO₂$ for Alibeyköy and Umraniye stations by a numerical method (Ercelebi and Toros [2009](#page-11-17)). A GIS-based decision support system for urban air quality management for the year 2007 was prepared, and primary sources of $SO₂$ were estimated as industrial activities and traffic appeared

Monthly average concentration values of all AQMSs over the study period were used as input of the factor analysis. ^aLoadings > 0.30 are given in the table, loadings > 0.7 are shown in bold. F1–F3: factors 1–3

the major source of NOx and CO (Elbir et al. [2010\)](#page-11-4). Another study estimated $CO₂$ emissions from urban passenger transportation of Istanbul (Batur et al. [2019](#page-11-18)). Gokce et al. ([2020\)](#page-11-14) investigated the exterior air quality of Eurasia Tunnel and even though an increase in $NO₂$ concentrations after tunnel operations was observed, no limit exceedance was estimated from the national legislation. In a study, the contribution of residential heating in Istanbul urban air quality for CO , $SO₂$, NOx, and PM_{10} was estimated (Baykara et al. [2019\)](#page-11-7). It was found that proportion of residential heating particularly in winter time emission inventory data was not negligible. It was found in another study that PM_{10} , SO_2 , and CO levels were higher in the European side than Asian side of the city, on the basis of measurement results from 2003 and 2013 (Yurtseven et al. [2018\)](#page-13-4).

Hot‑spots sufering from air pollution

Current HKDYY limit values which have been efective since January 1, 2019 are as follows: annual average $SO₂$ level is 20 μ g/m³, annual average NO₂ levels is 40 μ g/m³, annual average PM_{10} levels is 40 μ g/m³, 8-h average CO level is 10 mg/m³, 8-h average O_3 level is 120 μ g/m³, and annual average NO_x levels is set as $30 \mu g/m^3$ to protect the vegetation.

Among those air pollutants, PM and $NO₂$ levels appeared to pose problems in the next years for city of Istanbul in terms of sustaining the good air quality conditions to meet the requirements of national legislation. Thus, in this study, it was focused on NO_2 and PM_{10} levels in the last 3 years of the study period (2015–2017) to predict the potential hotspot destinations that may have poor air quality in the near future, because more attempts need to improve the air quality at those regions not to exceed the national limit values. As can be seen from Fig. [9](#page-10-0), 3-yr average PM_{10} levels exceeded the current annual PM_{10} limit value in all stations and high values were found in Esenyurt, Aksaray, Yenibosna, and Başakşehir, in descending order. As already mentioned earlier, Esenyurt is the most populated district of the city and new construction projects, mostly for residential settings have increased in the last decade. National house sale statistics for Istanbul city recorded that on average 240,000 houses were sold annually and almost half of them were the new houses bough by the first owner (TÜİK 2020). Also, a total of 5.4 million houses are available in Istanbul city in 2017 and approximately 11% of them are new big-residential housing projects by TOKI and other companies (EVA [2020](#page-11-19)).

 $NO₂$ levels exceeded the current annual $NO₂$ limit value in most of the AQMSs and high concentrations were found in Beşiktaş, Mecidiyeköy, Çatladıkapı, and Aksaray, in a descending order. The main common points of those districts are having very dense traffic load and populated with human activities throughout the day. Shopping,

Fig. 9 Heat map for 3-years average PM_{10} and NO_2 concentration at the AQMSs between 2015 and 2017

touristic, and cultural activities are held, and all types of transportation systems such as buses, tramway, subway, and ferry lines are used by many people around those districts. Also, both NO_2 and PM_{10} levels were above 60 µg/ $m³$ in Aksaray, located in the middle of the traffic junctions where many tramway, subway, and bus connection lines have transfer stop there.

In another study, impact of air pollution on respiratory hospital admissions between 2013 and 2015 was examined (Çapraz et al. [2017](#page-11-6)). Similar to our results, PM and $NO₂$ were responsible from the air pollution of Istanbul city, increasing the respiratory risk and hospital admissions.

The latest environmental status report for the Province of Istanbul published in 2018 indicated several outcomes, parallel to the results of this study observed that low levels of $SO₂$ were as a result of natural gas use for heating purposes; the highest $SO₂$ levels were observed in Kandilli where no industrial activity and traffic density were observed, but Kandilli is the berth for the ships passing over the Bosphorus, indicating the contribution maritime traffic; PM_{10} levels exceeded the limit values particularly in the regions where urbanization was boosted such as Esenyurt, lead to increase in traffic density and industrial activities, and rise in PM_{10} levels in Esenyurt, Başakşehir, Mecidiyeköy, Şirinevler, Ümraniye, Üsküdar were linked with the increased density of traffic (MOE&U 2018).

Conclusion

This study is aimed to investigate spatial and seasonal variations of air pollutants in Istanbul between 2007 and 2017. All air pollutants showed seasonal variations and all parameters were found to be higher during the heating periods than other periods ($p < 0.05$), except for ozone. CO and ozone showed statistically signifcant increasing trends over the years $(p < 0.001)$. Also, once ten-years average air quality data were compared with current air quality limit values which was effective since 2019, PM and $NO₂$ may have limit exceedance problems in the next years. $PM_{2.5}$ levels exceeded both WHO and EU limit values.

Overall, in terms of data quality, the data acquisition rates of the stations established for air quality measurements must be regular. Also, all air quality parameters are not measured at all stations. Moreover, the number of air quality measurement stations should be increased in terms of shifted population dynamics around new industrial settlements and districts with new housing projects. For instance, additional stations should be placed in and/or on the way through the new Istanbul airport, considering that the population and traffic will increase around there in the near future. Also, the fact that PM and NOx emissions coming from traffic appeared to be the most important source of air pollution in Istanbul, specifc measures to decrease traffic load over the city would improve the air quality such as park and ride, planning more bicycle ways, optimization of public transportation systems. Moreover, marine and airway emissions should be considered in the future plans and emission inventory of the city, since Istanbul is one of the most used transit region by both airlines and ships.

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Compliance with ethical standards

Conflict of interest The authors declare that they have no confict of interest.

Ethical approval This article does not contain any studies with human participants or animals performed by any of the authors.

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