

Unprecedented reduction in airborne aerosol particles and nitrogen dioxide level in response to COVID-19 pandemic lockdown over the Indo-Pak region

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Key Points:

- Whole of the World is under some sort of lockdown due to COVID-19.
- Controlled emissions from fossil fuels have improved the environmental pollutions.
- Huge drop in AOD ~ 45 % has foreseen over northern Indo-Pak Gangetic Plain
- NO₂ emission has also declined to 40-50 % after the national lockdown in Indo-Pak.
- Strong correlation exists between drop in AOD and NO₂ level.
- Satellites observations have strong capability to capture the environmental phenomena's over the Earth's planet.

Abstract

The present study have used space observations of NO₂ emission (OMI) and aerosol optical depth (AOD) (MODIS) from the last couple of years (2015-2019) to investigate the changes in air pollution in response to COVID-19 pandemic during the lockdown period (Mar-May, 2020) over the Indo-Pak region. Result of this study reveals a huge drop in air pollution that accounted for 40-50% reduction in NO₂ emissions and 45% in AOD over the whole Indo-Pak region. The major metropolitan areas (cities) of the region showed a remarkable decrease in NO₂ emissions, whereas the calculated rate of reduction was found highest for the city of Lahore (Pak) ranges between 29-52% followed by Ahmadabad (Chennai) as 27-52% (32-42%) respectively. The geospatial analysis revealed the existence of positive correlation (range from 0.23-0.50) between AOD and NO₂ emissions, which further implies that a decrease in AOD may be attributed to reduction in NO₂ to some extents.

Keywords: COVID-19; lockdown; NO₂ emission; aerosol optical depth; Ozone Monitoring Instrument (OMI)

37 Plain Language Summary

38 After an outbreak of novel infectious disease (COVID-19) which started at the end of 2019, later
39 on it turned into a global pandemic and spread across 212 countries over the world. Many
40 countries across the World went to strict lockdown measures which have been implemented by
41 government authorities to reduce the further spread of disease infections. It has severely posed
42 negative impacts on the social, human health and economic fronts, but on other way it also
43 proven that strict quarantine measures and lockdown activities has resulted in recovery of
44 environmental pollution. Huge drop in air pollution has been accounted as 40-50% in NO₂
45 emission and 45 % in aerosol particle thickness over the whole Indo-Pak region. Moreover, all
46 the major cities across the region also have shown substantial reduction in NO₂ emission duing
47 strick lockdown measures.

48 1. Introduction

49 The observed changes in the global climate system indicate enormous threats to anthropoid,
50 farming, nature, bionetwork, and eco-environment (Hussain et al., 2020; Hussain et al., 2019;
51 Iqbal et al., 2018b; Malik et al., 2020; Salam et al., 2020). Moreover, human activities and daily
52 demands are increasing continuously with fast growing world population, subsequently threatening
53 to the Earth's planet (Iqbal et al., 2018a; Iqbal et al., 2019). Indo-Pak region geographically
54 located in South Central Asia and mainly comprises of two main countries, Pakistan and India.
55 The two countries have ranked closely as developing countries in the last couple of years (Gul,
56 2009) and still these countries are using low quality fuel in transportation and in manufacturing
57 industries due to lack of developed technologies (Dhar and Shukla, 2015; Fullerton et al., 2008;
58 Gordon et al., 2014; Wang and Hao, 2012). Transportation and industrial activities in
59 Manchester cities of India (i.e., Ahmedabad) and Pakistan (i.e., Faisalabad) along with other
60 metropolitans are the major sources of anthropogenic emissions, resulting in environmental
61 pollution (Farooqi et al., 2020; Niaz et al., 2015; Qadeer et al., 2020). According to real-time
62 standard air quality index (US-EPA 2016 standard), Bangladesh country accounted as rank 1st
63 in the list of most polluted countries followed by Pakistan (2nd), and India (ranked 5th). In the list of
64 World most polluted cities, most of the top 30 polluted cities come across the South Asia
65 especially in India, Pakistan and China (Beig et al., 2020; Conticini et al., 2020; Gao et al., 2020;
66 Maji, 2020; Mathur et al., 2020; Yousefian and Nadafi, 2020). The reasons behind the air
67 pollution across these countries is not limited to only low literacy rate, lack of awareness, dense
68 population, and industrial activities, but also the use of low quality fuel, burning of waste
69 material and less use of advance recycling technologies (Kannan et al., 2020; Patel et al., 2020).
70 Nitrogen Dioxide (NO₂) is mainly emitted from anthropogenic emissions e.g., fuel combustion in
71 traffic and industrial sectors are the main source of NO₂ emission. Lippmann and Leikauf, (2020)
72 reported that, human exposure in excessive NO₂ environment for long and short term might surge
73 the impermanence rate. Shang et al., (2020) and Yang et al., (2020) revealed that environment
74 polluted with excess NO₂ may cause cellular inflammation, severe respiratory problem and
75 bronchial hyper responsiveness. WHO reported that every year more than 4.62 million people
76 died globally due to poor air quality standards. Similarly aerosol particles not only directly
77 induced from anthropogenic and natural sources, but are also formed through various physico-
78 chemical processes in the atmosphere (Seinfeld and Pandis, 2016). Majority of the aerosols
79 formed in Indo-Pak regions are associated with anthropogenic emissions such as vehicles, coal-
80 fired power plants, industrial sources, burning in agriculture farms (Guo et al., 2017). Several

81 legislations have been implemented over the past several years to reduce the air pollution,
82 however the current air pollution level is still exceeding the WHO Air Quality standards over
83 most major metropolitan cities.

84 However, an outbreak of COVID-19 which starts in late Dec, 2019 and later on it spreads
85 quickly to many other countries (212 countries and territories) over the world and turned into
86 global pandemic (Ferretti et al., 2020; Givi et al., 2020; Mittal et al., 2020; Organization, 2020;
87 Rana et al., 2020). After observing the situation about COVID-19, the World Health
88 Organization (WHO) declared health emergency on January 30, 2020 worldwide (Sohrabi et al.,
89 2020). Many countries started to follow the precautionary measures, while with the
90 implementation of lockdown situation the major human activities e.g., culture and education and
91 industrial manufacturing sectors were constrained globally (NASA, 2020; Tosepu et al., 2020) to
92 prevent the further spread of COVID-19 (Narayanan and Saha, 2020; Paital et al., 2020). In a
93 lock down situation, transport, industrial and manufacturing sectors were effected badly and
94 demand of fuel is reduced drastically, which cut down the oil prices sharply (Devi, 2020;
95 Fernandes, 2020). No doubt, the strict lockdown measures have severely posed negative impacts
96 on the social, human health and economic fronts globally (ESA, 2020), but on other way,
97 positive affections were also observed in the reduction of air pollution (Wright, 2020). For
98 example, Ozone Monitoring Instrument (OMI) and Tropospheric Monitoring Instrument
99 (TROPOMI) were recently launched to monitor the real-time air pollution across the globe, and
100 the observations revealed a significant reduction in airborne aerosol optical depth (AOD),
101 nitrogen dioxide (NO₂) and PM_{2.5} concentrations coinciding with the strict quarantine measures
102 (Muhammad et al., 2020; Timmermann et al., 2020). So there is an important need to quantify the
103 effects of reduced regional anthropogenic aerosol emissions as well as NO₂ emissions over the
104 Indo-Pak region during COVID-19 epidemic lockdown.

105 This study made an attempt to to investigate the changes in anthropogenic aerosol
106 emissions as well as NO₂ emissions in response to COVID-19 pandemic lockdown across the
107 Indo-Pak region. Tropospheric NO₂ data was taken from multi missions Ozone Monitoring
108 Instrument (OMI) and aerosol optical depth (AOD) from The Moderate Resolution Imaging
109 Spectroradiometer (MODIS) aboard NASA's Terra sensor from Jan-May (2020) and compared
110 with past several years avegage (2015-2019) for same time frame. The Indo-Pak region is
111 geographically located in South Central Asia and mainly comprises of two main countries,
112 Pakistan and India (**Figure S1**). In total, five main cities, Karachi (Pak), Lahore, (Pak), New
113 Delhi (IND), Ahmadabad (IND) and Chennai (IND) are chosen for this study to investigate the
114 changes in air pollution during COVID-19 pandemic situation.

115 **3. Data collecton and methodology**

116 Satellites in space provide global observations of air pollutants, i.e. aerosol optical depth (AOD)
117 and tropospheric NO₂ emissions for air quality monitoring over the Earth's planet. The Moderate
118 Resolution Imaging Spectroradiometer (MODIS) aboard NASA's Terra and Aqua satellites
119 provides dataset to monitor aerosol optical depth and size distribution of the ambient aerosol. In
120 this study latest record of daily aerosol optical depth (MOD08_D3) at 550 nm (AOD) of MODIS
121 aboard NASA's Terra sensor was acquired at 1° × 1° (Platnick et al., 2015). Ozone Monitoring
122 Instrument (OMI) onboard the NASA Aura satellite provides the NO₂ column density and
123 available from Oct, 2004 to present. In this study, daily average tropospheric NO₂

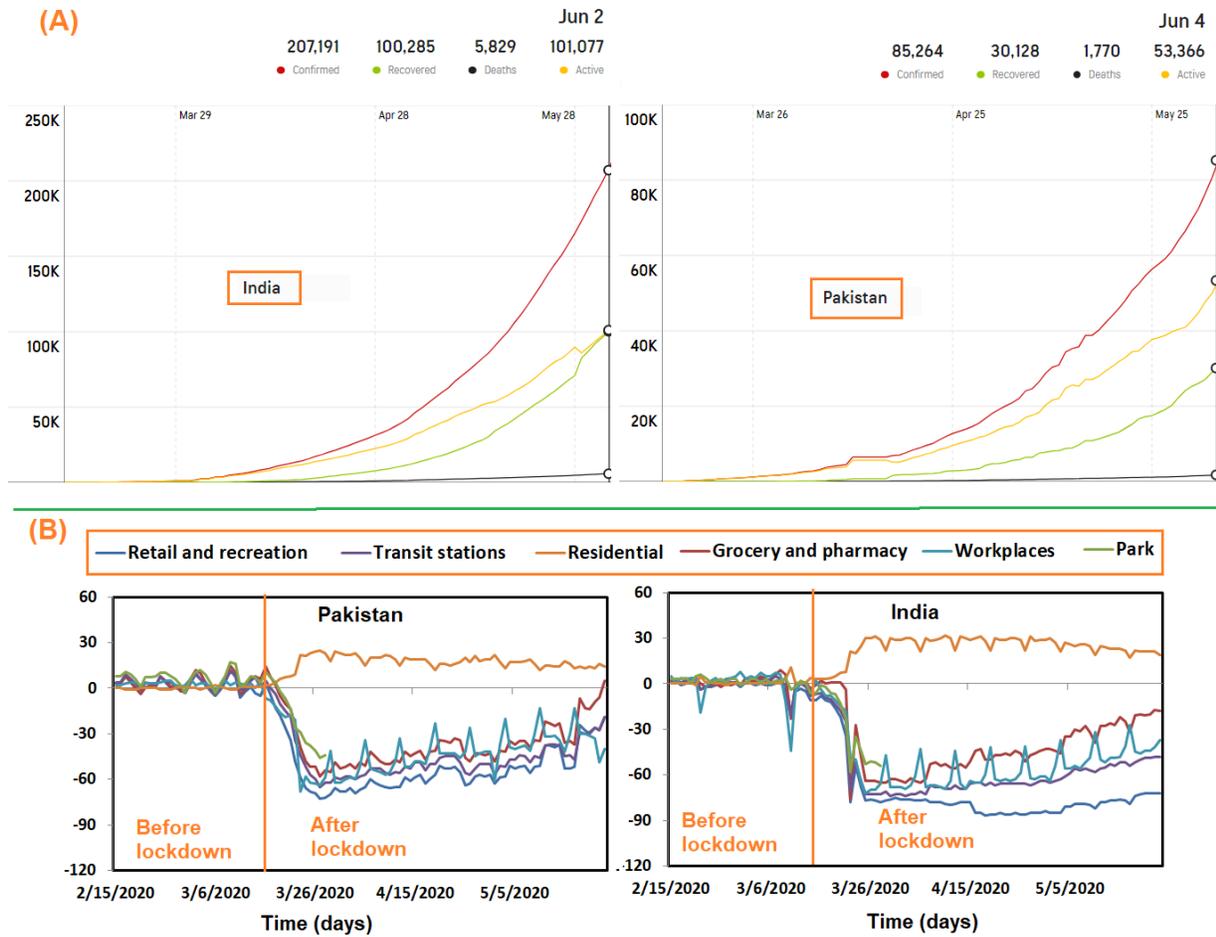
124 (OMNO2d.003) data was used due to improved algorithms and sensitivity of OMI for NO₂
125 detection at lower atmosphere. The tropospheric NO₂ columns are retrieved from satellite
126 observations based the differential optical absorption spectroscopy (DOAS) technique within
127 405-465 nm (Eskes et al., 2003; Van et al., 2020). Moreover, detailed description about the
128 DOAS analysis and algorithm, data filtering, and quality control methods is available at
129 <https://earthdata.nasa.gov/>.

130 Daily tropospheric NO₂ and AOD data over the Indo-Pak regions was processed using
131 NASA Giovanni user interface publically available at <https://giovanni.gsfc.nasa.gov/giovanni/>.
132 Giovanni is a web application that provides a simple, intuitive way to visualize, analyze, and
133 access earth science remote sensing data, particularly from satellites. Maps of NO₂ and AOD
134 were made from daily gridded data (Mar-May) averaged over the past years 2015-2019 and
135 compared with 2020 (befor and after lockdown). Anomaly changes in tropospheric NO₂ and
136 AOD were computed by mean of absolute difference (average over past years minus (-) 2020). In
137 order to investigate the tropospheric NO₂ variations over major cities, time-series plots of
138 tropospheric NO₂ were made by means of the 15-days average over the 1° x 1° grid box drawn
139 around the cities. NO₂ data from OMI sensor, over the major cities was extracted from NASA,
140 Goddard Space Flight Center (https://so2.gsfc.nasa.gov/no2/no2_index.html). Moreover, recent
141 imageries of NO₂ and AOD released by NASA were also used to investigate the variations in air
142 pollution before and after lockdown period across the Indo-Pak region. Mobility trend of
143 different human activities was tracked from Google reports from Mar-May 2020 to understand
144 the anthropogenic changes caused by pandemic lockdown. **Table S1** describes the detail of
145 datasets used in this study. Geospatial statistical correlation between AOD and NO₂ was also
146 analyzed in ArcGIS to highlight the impacts of air pollution on aerosol optical depth.

147 **4. Results and Discussion**

148 **4.1 COVID-19 and lockdown scenarios in Indo-Pak**

149 Outbreak of COVID-19 started in India and Pakistan after 15 March and few cases were detected
150 but after 1st April, 2020, COVID-19 spread with faster rate over the Indo-Pak (Pakistan and
151 India). Daily time series of COVID-19 cases, number of death and recovered since the epidemic
152 began, as well as the mobility index of different human activities over the Indo-Pak region is
153 being explained in **Figure 1**. (WHO, 2020). Until now, the number of case has reached to >
154 85,000 (Pakistan) and > 212,999 (India) until 4th June, 2020 (WHO) (**Figure 1a**). All activities
155 including transport, industries, social places and educational sectors were running normally until
156 27 Mar 2020, but after situation getting worse Government authorities in both countries declared
157 stick lockdown for citizens and stopped all human activities to minimize the fast transmission of
158 the COVID-19. The mobility index data of different human activities (Retail/recreations,
159 grocery/ pharmacy, work places, transit stations and residential) clearly indicated that after stick
160 lockdown measures the mobility trends of human activates e.g., retail and recreations trend has
161 reduced to 80-90 % over India and 60-70 % over Pakistan, while the trend in residential has
162 gradually increased by 30-35 % over India and 25-28 % over Pakistan (**Figure 1b**). Mobility
163 trend at work places (industries, colleges and social places) as well as public transport has also
164 reduced with a great magnitude since the epidemic began.

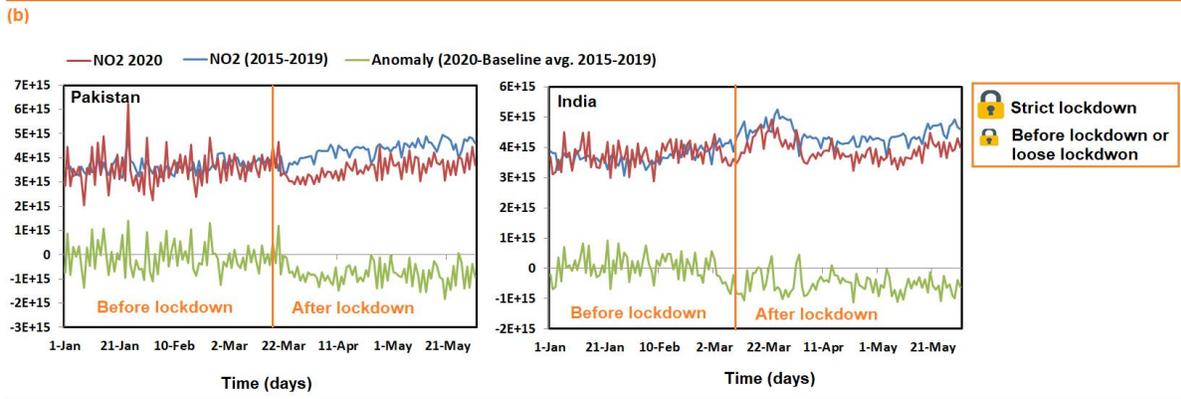
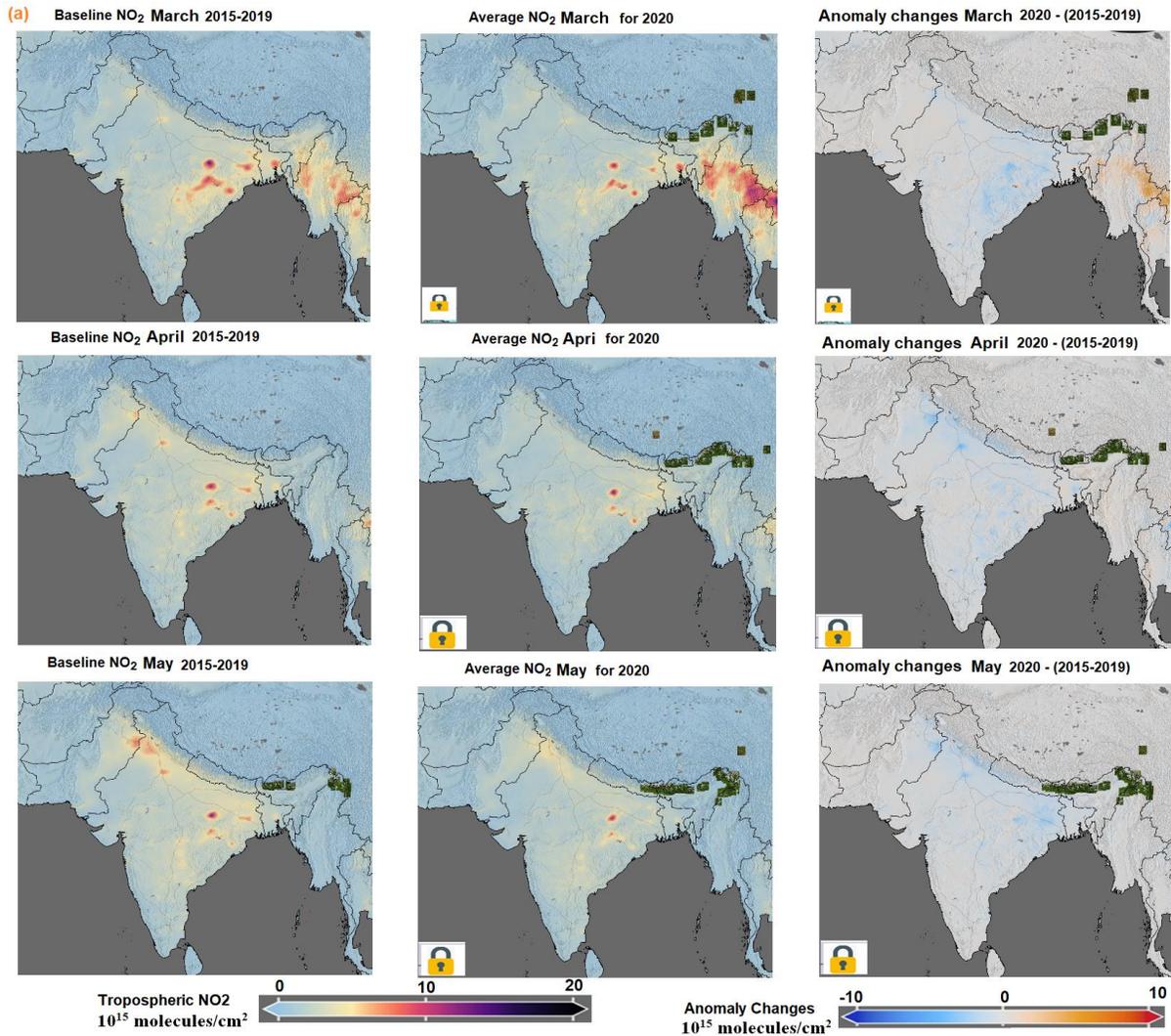


165
 166 **Figure 1.** Daily time series of (a) COVID-19 cases, number of death and recovered, and (b) Mobility index of
 167 different human activities over the Indo-Pak region since the epidemic began.

168 **4.2 Tropospheric NO₂ changes over Indo-Pak**

169 Strict lockdown measures adapted during the COVID-19 epidemic have decreased the power
 170 generation, energy consumption and lower the oil demand and consequently have posed
 171 significant positive implications on ecosystem (Sulaman et al., 2020). **Figure 2a** illustrated the
 172 variations in monthly NO₂ emissions during 2020 lockdown compared to past years' average
 173 (2015-2019) over Indo-Pak region. The images in the 1st column show the NO₂ emission (Mar-
 174 May) averaged over baseline 2015-2019; images in 2nd column show the NO₂ emission (Mar-
 175 May) during 2020 lockdown while images in 3rd column show anomaly changes in 2020 with
 176 respect to baseline period 2015-2019. It was seen that value NO₂ emissions were much higher in
 177 Mar, 2020 over the East Indian region as $\sim 15 \times 10^{15}$ molecules/cm² comparative to baseline
 178 period. However NO₂ level has reduced to greater extent in 2020 lockdown especially from
 179 Apr-May compared to baseline 2015-2019 (Apr-May). Moreover, **Figure 2b** shown the time
 180 series of daily NO₂ emissions extracted during 2020 (before and after lockdown) and compared
 181 with baseline period (2015-2019) over Indo-Pak. It was observed that running mean of NO₂
 182 value during 1Jan-20Mar, 2020 (before lockdown) is coinciding in fluctuation trend with average
 183 time series of 2015-2019. While during lockdown (20 Mar – 30 Apr, 2020), time series of mean

184 NO₂ emission over the Indo-Pak is moving with lower running mean value compared to 2015-
 185 2019.

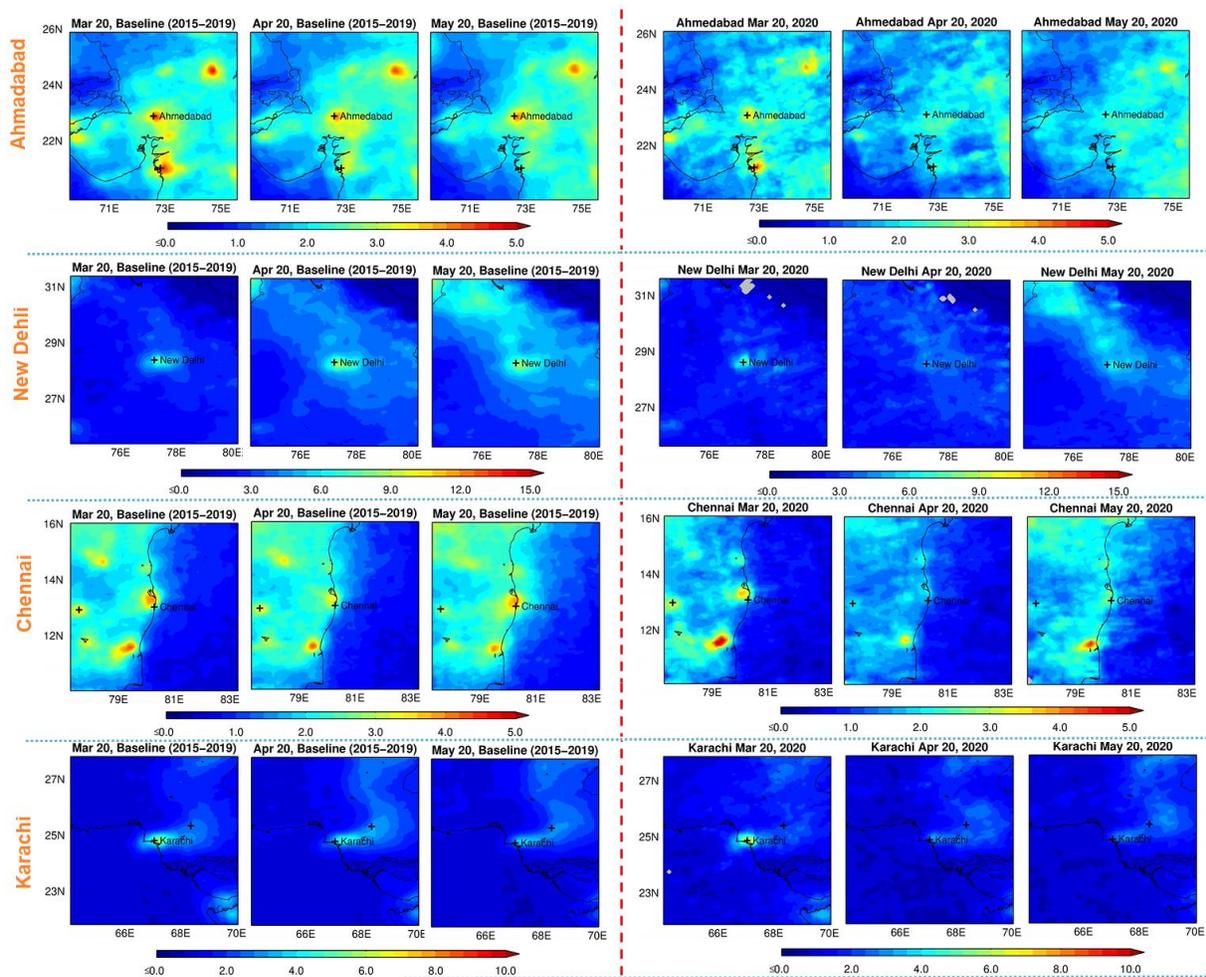


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187 **Figure 2.** Variations in troposphere NO₂ level (a) monthly tropospheric NO₂ in 2020 compared
 188 to past years' average (2015-2019), and (b) daily time series of NO₂ in 2020 compared to past

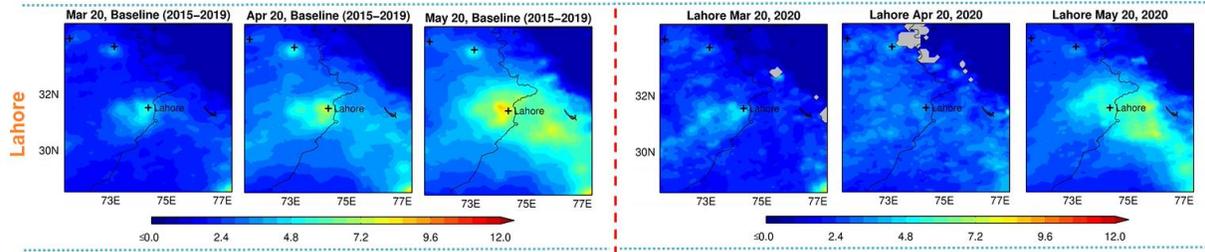
189 years' average (2015-2019) over India and Pakistan in 2020 : (NO_2 level represents in 10^{15}
 190 **molecules/cm²**).

191 From **Figure 2b**, it was also seen that anomaly changes in NO_2 emission during Jan-Mar
 192 2020 (before lockdown) showing positive trend indicating the high emissions from industrial and
 193 transport activities compared to past years. While anomaly changes in NO_2 emission during Mar-
 194 May 2020 (after lockdown) showing negative trend after strict lockdown measures due to
 195 reduction in industrial and transport emissions. New satellite images released by the European
 196 Union Copernicus programme from the Copernicus Sentinel-5P satellite, also revealed that NO_2
 197 emission has dropped $\sim 40\text{--}50\%$ in Mar- Apr 2020 compared to same time-frame in last year
 198 over the Indo-Pak (ESA, 2020). Recent improvements in air quality are associated with less
 199 consumption of fossil fuels during strict quarantine measures adapted across the countries (ESA,
 200 2020; Wang and Su, 2020). Sharma et al., (2020) also reported that NO_2 emission has dropped
 201 over the India during Mar-Apr 2020 compared to past years average due to restricted emission
 202 from anthropogenic activities. Air Quality Space Observation Laboratory from NASA reported
 203 that the power generation over Indo-Pak region has reduced to 10-25% during pandemic
 204 lockdown period compared to past years in the same time frame (NASA, 2020).



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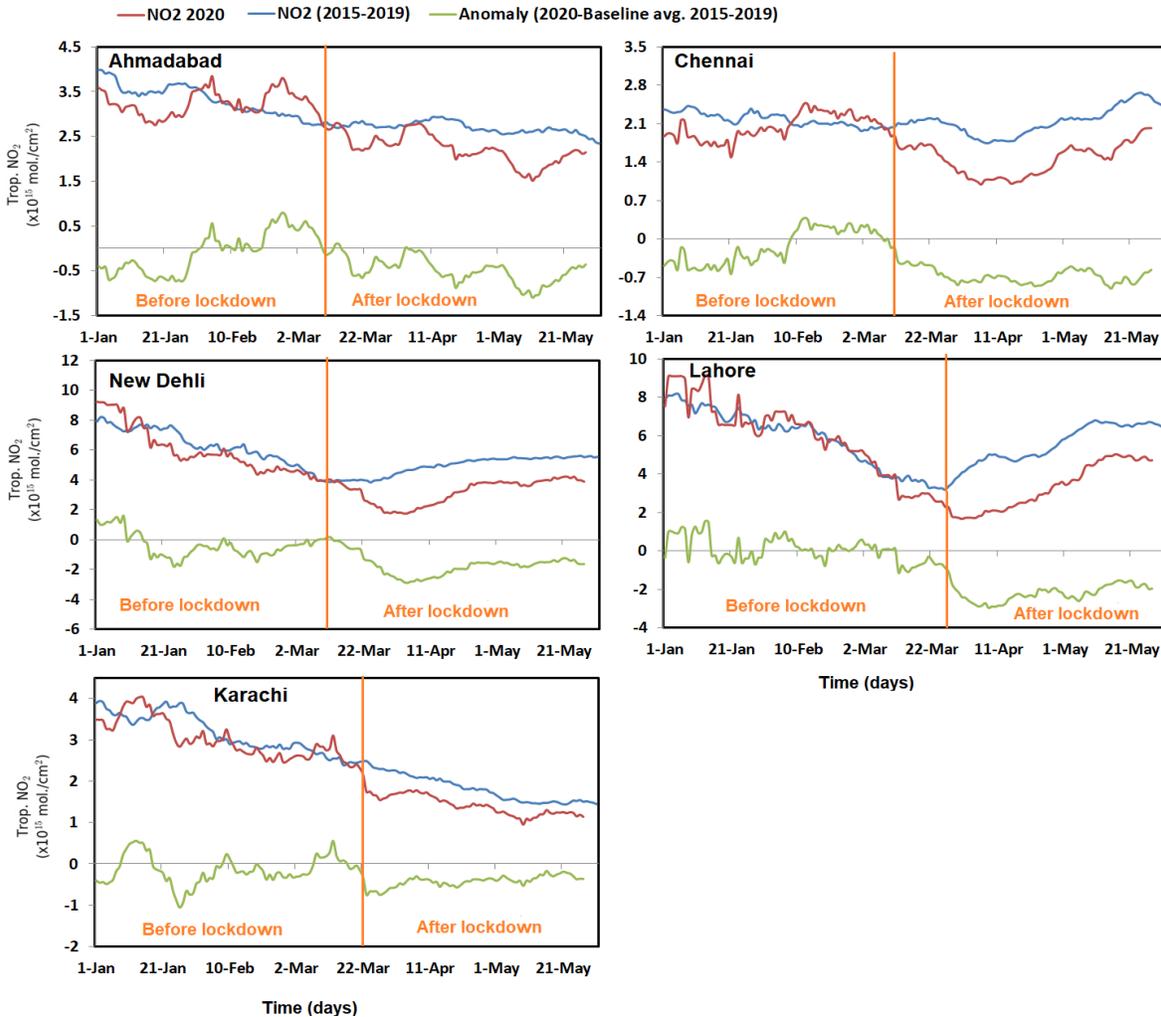
208 **Figure 3.** Changes in NO₂ emission in Apr, 2020 compared to the average of baseline 2015-2019
 209 over the five major cities in Indo-Pak region: (NO₂ level represents in 10¹⁵ molecules/cm²).

210

211 Moreover this study, also analyzed spatio-temporal variations of NO₂ emission from
 212 Mar-May, 2020 compared to the average of same time-frame in baseline period (2015-2019)
 213 over the five main cities (Karachi, Lahore, New Delhi, Ahmadabad, and Chennai) in Indo-Pak
 214 (**Figure 3**). images displayed in first three columns illustrate the NO₂ emission in baseline period
 215 (2015-2019) for Mar, Apr and May while next three columns illustrate the images for 2020
 216 during Mar, Apr and May. Evidence from these data indicates dramatic reduction in
 217 NO₂ emission during 2020 especially during the strict lockdown (Apr-May) when compared with
 218 baseline data over all cities. For example, NO₂ emission over the New Ahmadabad (IND) was
 219 $\sim 5 \times 10^{15}$ molecules/cm² during Mar-May in past years average (2015-2019) while it has dropped
 220 to $< 2.5 \times 10^{15}$ molecules/cm² in 2020 (**Figure 3**). The updated evidences from NASA (National
 221 Aeronautics and Space Administration) and ESA (European Space Agency) and from other
 222 researches have stated that, air pollution has significantly reduce over the metropolitan and
 223 industrialized regions from last several weeks (ESA, 2020; Nakada and Urban, 2020; NASA,
 224 2020) due to strict lockdown measures adapted during epidemic (Chauhan and Singh, 2020;
 225 Sulaman et al., 2020). **Table S2** revealed percentage changes in NO₂ level over major cities of
 226 Indo-Pak regions in 2020 during different lockdown scenarios compared to baseline period
 227 (2015-2019). Its negative values represented the level of NO₂ emission dropped in April-2020
 228 compared to past years (2015-2019). For example, a significant reduction in NO₂ emission was
 229 counted to ~ 19 -35 % over Ahmadabad, 27-52 % over New Delhi, and 32-42 % over Chennai,
 230 28-34 % over Karachi and 29-52 % over Lahore during 15 Mar – 31May, 2020 (lockdown)
 231 compared to past years. New data from the Copernicus Sentinel-5P satellite also revealed ~ 40 -
 232 50% reduction in NO₂ emission over major cities across India (ESA, 2020).

233 **Figure 4** illustrated the time series extracted over the 1° x 1° grid box drawn around the
 234 cities and indicates mean NO₂ emission and anomaly changes in 2020 compared to baseline
 235 average 2015-2019. Evidence from these results demonstrated that before lockdown (1 Jan – 15
 236 Mar) running mean and anomaly time series is coinciding with average of 2015-2019 in a
 237 fluctuation trend. However after lockdown (15 Mar - Apr), mean NO₂ and anomaly values has
 238 dropped and running with lower values compared to average of 2015-2019 time series. It was
 239 seen that during first 10 week of 2020, the NO₂ emission is increasing compared to past years
 240 due to more industrial development and more emissions from transports while after the 10th week
 241 of 2020 NO₂ level is declining and reached to the lowest value of past 5 years average. Mahato et
 242 al., (2020) has also reported that as a result of restricted anthropogenic emissions, the level of
 243 NO₂ has drastically slowed down just within few days during the lockdown period across the
 244 major cities of India. Some scientists reported that due to decline in air pollution level the sky
 245 over the most polluted city (e.g., New Delhi) is clearly visible than before (Kohli, 2020; Wright,

246 2020). Restricted use of fossil fuels in transportation and in the industrial sectors during the
 247 pandemic lockdown has significantly improved the air quality from 40-54 % over the Indo-Pak
 248 region (Mahato et al., 2020). *Dahiya and Butt* from Centre for Research on Energy and Clean Air
 249 also reported that air pollution levels across main cities of Pakistan has also dropped drastically
 250 due to less fossil fuel consumption in transportation, industries and power plants in result of
 251 nationwide lockdown. The average drop in NO₂ emission over the major cities such as Mumbai,
 252 Pune and Ahmedabad was 40–49% during March 2020 (during the lockdown) when compared
 253 with March 2019 (Wright, 2020) which is consistent with less emission of effluents due to
 254 shutdown of industrial activities (Gandhiok, 2020).

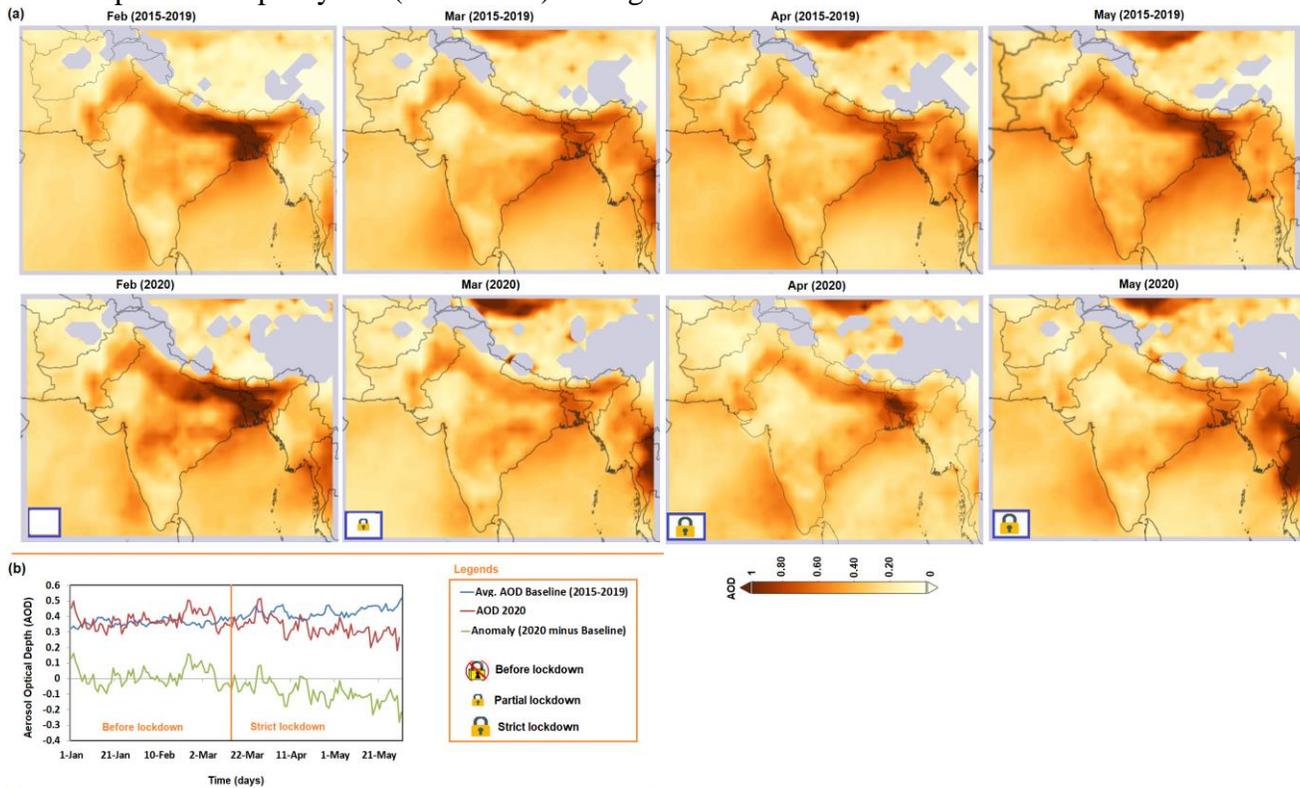


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 256 **Figure 4.** Daily time series of 15 days moving average of NO₂ emission and anomaly changes in
 257 2020 compared to the baseline period 2015-2019 across the five major cities.

258 **4.3 Airborne Aerosol Optical Depth (AOD) over Indo-Pak**

259 Every year, aerosols released from human induced sources and contribute to unhealthy levels
 260 of air pollution over major cities in Indo-Pak (Murari et al., 2015). Higher value of aerosols
 261 optical depth of 1 or above indicates very hazy conditions while its value less than 0.1 over the

entire atmospheric vertical column is considered “clean”. **Figure S2** depicted the recent images of AOD released by NASA reported a reduction in aerosol optical depth over the Indo-Pak region during Mar –April 2020 (after lockdown) when compared with past years 2016 – 2019 (before lockdown) (NASA, 2020). It could be seen that AOD has reduced to greater extent in 2020 compared to past years especially at North Indo-Gangetic Plain. In this study, daily and monthly time series of aerosol optical depth (AOD) were retrieved from the MODIS on NASA’s Terra satellite and processed through NASA Giovanni user interface from I Jan – 30 May, 2020, and compared with past years (2015-2019) average.



270

271 **Figure 5.** Changes in aerosol optical depth (AOD) in 2020 compared to past years average (a)
 272 monthly spatio-temporal changes in AOD during 2020 compared to baseline (2015-2019), and
 273 (b) daily AOD area averaged time series in 2020 compared to baseline (2015-2019) over Indo-Pak
 274 Gangetic Plain.

275 Spatial changes in aerosol particle depth during Feb-May, 2020 (lockdown period) were
 276 investigated and compared with past years average (2015-2019) (before lockdown), over Indo-
 277 Pak Gangetic Plain (**Figure 5a**). AOD maps clearly depicted that its spatial extent and magnitude
 278 is much higher over Indoian Gangetic Plain compared to Pakistan which can be explained by
 279 higher cost of transport emissions, and climate variations. It was seen that average monthly
 280 AOD during Feb-Mar 2020 is largely consistent with last year’s average (2015-2019) in same
 281 time-frame. However mean AOD of Apr-May, 2020 has reduced with a greater extend when
 282 compared with baseline (2016-2019). Reduction in AOD is consistent with epidemic lockdown
 283 due to less emission of particles (such as nitrogen, sulfates) from human induced activities.
 284 However huge reduction of about 45 % in AOD has foreseen over northern Indo-Pak Gangetic
 285 Plain in Apr, 2020 compared to past years average. Time series of daily aerosol optical

286 (AOD_{550nm}) averaged over Indo-Pak is shown in **Figure 5b**. It can be seen that AOD level is
287 increasing during the first 11 weeks of 2020 compared to baseline period while after 11th week
288 (during the lockdown) it started to decline and reached to lowest observation on the date in
289 MODIS record, due to less emission of particles from anthropogenic sources. NASA scientist at
290 Marshall Space Flight Center “Pawan Gupta” from University of Space Research Association
291 (USRA) claimed that, he never seen dramatic reduction in aerosol over the Indo-Pak Gangetic
292 Plain during Mar-Apr, 2020, when compared with same time-frame over the past years average
293 (NASA, 2020). According to Pawan Gupta, aerosol particle depth in northern plain was recorded
294 as lowest in April, compared to past 20 years observations of MODIS (NASA, 2020). Majority
295 of the aerosols formed in Indo-Pak regions are associated with anthropogenic emissions such as
296 vehicles, coal-fired power plants, industrial sources, burning in agriculture farms (Guo et al.,
297 2017). However, restricted use of fossil fuels in transportation and industrial sectors during the
298 pandemic lockdown has decreased the emissions sources of airborne particles in atmosphere,
299 (Mahato et al., 2020) subsequently air pollution across the countries has drastically slowed down
300 just within few days (Isaifan, 2020; Sharma et al., 2020).

301 Geospatial statistical correlation between daily changes aerosol optical depth and NO₂
302 was investigated to analyze the possible relationship between bother variables. **Figure S3**
303 illustrated the spatial correlation between AOD and NO₂ as well as time series correlation over
304 the Indo-Pak region. It was seen that high negative spatial correlation exists between AOD and
305 NO₂ emission over some region in south side of India, however in most of the regions spatial
306 correlation was found to be positive in range of 0.23-0.50 especually over the Indo-Pak Gangetic
307 Plain. The positive correlation depicted that a decrease in AOD may be expained by reduction
308 in NO₂ to some extents. Overall correlation between AOD and NO₂ was found tobe 0.32 over the
309 Indo-Pak region which illustrates that reduction in both variables may link to each other over the
310 study region.

311

312 **5. Conclusions**

313 After an outbreak of novel infectious disease (COVID-19) which started at the end of 2019, later
314 on it turned into a global pandemic and spread across 212 countries over the world. Many
315 countries across the World went to strict lockdown measures which have been implemented by
316 government authorities to reduce the further spread of disease infections. In this study, the effects
317 of restricted human activities since mid -March of 2020 were highlighted on changes in air
318 pollution across the Indo-Pak region. Comparison of space observations from last couple of years
319 with current data helps to understand the potential effect of precautionary measures on
320 environment during the lockdown period. Result of this study revealed that huge drop in air
321 pollution was accounted as 40-50% in NO₂ emission and 45 % in aerosol particle thickness over
322 the whole Indo-Pak region. Moreover, all the major cities across the region also have shown the
323 significant reduction in NO₂ emission as ~ 19-35 % over Ahmadabad, 27-52 % over New Delhi,
324 and 32-42 % over Chennai, 28-34 % over Karachi and 29-52 % over Lahore during 15 Mar –
325 31May, 2020 (lockdown) compared to past years. Significant correlation between AOD and NO₂
326 further implies that changes in AOD may be proxies to reduction in trace gasses to some extents.
327 Moreover this study suggested that the reduction in aerosol particle thickness and NO₂ emission is
328 associated with less consumption of fossil fuels during COVID-19 pandemic situation.

329 **Author Contributions**

330 **A. Arshad, S. Hussain, F. Saleem and M. Shafeeque:** Conceive the idea, Investigation, Data
331 curation, Software, Visualization, Writing-original draft. **M. Shafeeque, S. N. Khan, M. S.**
332 **Waqas and F. Saleem:** Writing, review & editing, Proof reading and article formatting.

333 **Declaration of competing interest**

334 The authors declare no conflict of interest.

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338 Fellowship Program (<https://twas.org/opportunity/cas-twas-presidentsphdfellowship-programme>) for
339 providing financial support for this project as well for Ph.D studies. The tropospheric NO₂
340 (OMNO2d.003) data of OMI sensor and aerosol optical depth (MOD08_D3) at 550 nm (AOD)
341 of MODIS aboard NASA's Terra sensor used in this study were collected from
342 <https://disc.gsfc.nasa.gov/datasets> and analysis were performed by using NASA Giovanni user
343 interface (v4.34) <https://giovanni.gsfc.nasa.gov/giovanni/>. Moreover the daily time series of
344 tropospheric NO₂ over the major cities was accessed from NASA Atmospheric Chemistry and
345 Dynamic Laboratory (Code614) available at https://so2.gsfc.nasa.gov/no2/no2_index.html.

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