

## Ceramic industry at Morbi as a large source of SO<sub>2</sub> emissions in India

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### Key Points:

- First satellite estimates of SO<sub>2</sub> emissions from India's Morbi ceramic industry.
- SO<sub>2</sub> ceramic emissions are similar to those from large refineries and power plants.
- Morbi ceramic SO<sub>2</sub> emissions are ~5 times higher in 2017 compared to 2005.

### Abstract

Observations from the Ozone Monitoring Instrument (OMI), onboard the NASA's Earth Observing System (EOS) Aura satellite, reveal a large SO<sub>2</sub> "hotspot" over Morbi, Gujarat, India, while the available emissions inventories do not report any major sources in this region. There are no industries that are typically associated with the elevated SO<sub>2</sub> such as large power plants, smelters, or oil refineries in the Morbi region. Our analysis shows that the elevated SO<sub>2</sub> source is attributed to the ceramic industries in an area of ~7 x 7 km<sup>2</sup> near the city. OMI-estimated SO<sub>2</sub> emissions from the Morbi ceramic industries have been near or above 100 kt y<sup>-1</sup> since 2009, which are similar to emission levels from larger Indian oil refineries (such as Essar and Jamnagar) and power stations (such as Mundra Thermal Power Station and Ultra Mega Power Plant) located in Gujarat, India. According to OMI measurements, the SO<sub>2</sub> emissions from the Morbi ceramic industries are presently five times higher than they were in 2005. This study demonstrates that in the absence of any other information about SO<sub>2</sub> emissions from the ceramic industry, these satellite-based estimates can fill the gap in emission inventories in a timely fashion.

**Keywords:** sulfur dioxide, emissions, OMI, ceramic

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## 33 1. Introduction

34 Sulfur dioxide (SO<sub>2</sub>) is a short-lived atmospheric air pollutant emitted or formed in the atmosphere  
35 through natural and anthropogenic processes, and plays an important role in the atmospheric  
36 environment and global sulfur cycle. Once emitted SO<sub>2</sub> can deposit on the surface or be transformed  
37 chemically into particulate matter (i.e., sulfate aerosol). SO<sub>2</sub> and its oxidation products are considered as  
38 designated criteria air pollutants in many countries worldwide due to their various environmental and  
39 health consequences (Kharol et al., 2017). To supplement surface monitoring, a handful of satellite  
40 sensors have provided information on the global distribution of SO<sub>2</sub> since the 1990s (Krotkov et al.,  
41 2008; Li et al., 2013; Theys et al., 2015). In particular, these satellite observations are used extensively  
42 to detect anthropogenic SO<sub>2</sub> signals from large individual point sources such as copper and nickel  
43 smelters, power plants, oil and gas refineries, and other sources (Bauduin et al., 2016, 2014, Carn et al.,  
44 2007, 2004; de Foy et al., 2009; Fioletov et al., 2013; Lee et al., 2009; McLinden et al., 2014, 2012;  
45 Nowlan et al., 2011; Thomas et al., 2005). They can also provide information on SO<sub>2</sub> emissions from  
46 volcanic sources whereas other information is often not available (Carn et al., 2017). Satellite data are  
47 also used to study the evolution of SO<sub>2</sub> amounts over large regions such as eastern U.S. (Fioletov et al.,  
48 2015, 2011; Kharol et al., 2017), Europe (Krotkov et al., 2016), China (Jiang et al., 2012; Koukouli et  
49 al., 2016; Li et al., 2010; Witte et al., 2009), and India (Lu et al., 2013). Recently, Li et al. (2017)  
50 noticed that, with its 50% increase in SO<sub>2</sub> emissions since 2007, India is surpassing China and becoming  
51 world's largest emitter of anthropogenic SO<sub>2</sub>.

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53 As SO<sub>2</sub> emissions are important for air quality, emission inventories often provide estimates for them  
54 (Klimont et al., 2013), and satellite data-based emission estimates are proven to be a valuable addition to  
55 the conventional bottom-up emission inventories (Liu et al., 2018). Emissions from power plants, oil  
56 refining processes, metal ore smelting factories as well as from natural sources such as volcanoes are  
57 estimated from satellite measurements (Carn et al., 2017; Fioletov et al., 2016). Despite what is  
58 becoming an increasingly important complete global picture of SO<sub>2</sub> emissions, we found that a large  
59 emission source from the Indian ceramic industry near Morbi is currently missing from leading emission  
60 inventories such as Hemispheric Transport of Air Pollutants (Janssens-Maenhout et al., 2015), and can  
61 also be monitored by satellites. Ceramic products are manufactured from clays and other non-metallic  
62 inorganic materials. The clay minerals that are used as raw materials in ceramic industries often contain

63 high levels of sulfur. In addition, coal used in firing the ceramic products may contain sulfur that is  
64 oxidized to SO<sub>2</sub> in the process.

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66 Due to high prices of natural gas, most of the ceramic industry in Morbi uses low quality coal (BEE,  
67 2010), which is one of the major sources of SO<sub>2</sub> emissions. The supply of relatively inexpensive coal for  
68 ceramic industries is fulfilled by coal producing states of India (e.g., West Bengal, Jharkhand and  
69 Chhattisgarh). The increased SO<sub>2</sub> emissions from ceramic industries not only affect the health of  
70 ceramic workers, but also degrade the air quality in the neighboring populated areas causing deleterious  
71 health effects (Seabrook, et al., 2019) regionally and is responsible for vegetation damage (Wen, et al.,  
72 2006).

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74 The main objective of the study is to quantify regional SO<sub>2</sub> emissions, with a focus on those from the  
75 ceramic industries near Morbi, India using Ozone Monitoring Instrument (OMI) satellite data. This is  
76 the first study of its kind to identify and estimate SO<sub>2</sub> emissions from ceramic industries. The  
77 methodology is described in section 2. Section 3 demonstrates the results of the study.

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## 79 **2. Data sets & Methodology**

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### 81 **2.1. OMI Satellite observations**

82 The Ozone Monitoring Instrument (OMI) is particularly useful for SO<sub>2</sub> monitoring from space. OMI is a  
83 Dutch-Finnish UV-Visible wide field-of-view nadir-viewing spectrometer flying on NASA's EOS Aura  
84 spacecraft (Schoeberl et al., 2006), providing daily global coverage at high spatial resolution (Levelt et  
85 al., 2006). The overview of OMI operation, products, science and applications has been published  
86 recently (Levelt et al., 2018). Operational OMI Planetary Boundary Layer (PBL) total column SO<sub>2</sub> data  
87 produced with the Principal Component Analysis (PCA) algorithm (Li et al., 2013) for the period 2005-  
88 2017 were used in this study. SO<sub>2</sub> vertical column densities (VCDs) (which represent the total number  
89 of molecules or total mass per unit area) are retrieved assuming PBL SO<sub>2</sub> profile shape and given in  
90 Dobson units (DU, 1 DU = 2.69•10<sup>26</sup> molec•km<sup>-2</sup>). A climatological SO<sub>2</sub> profile over the summertime  
91 eastern U.S. was used in the retrievals (Li et al., 2013). Only clear-sky data, defined as having a cloud  
92 radiance fraction (across each pixel) less than 20%, and only measurements taken at solar zenith angles

93 less than  $70^\circ$  were used. OMI  $\text{SO}_2$  data are retrieved for 60 cross-track positions (or rows), and the pixel  
94 ground size varies depending on the track position from  $13 \times 24 \text{ km}^2$  at nadir to about  $28 \times 150 \text{ km}^2$  at  
95 the outermost swath angle. Data from the first 10 and last 10 cross-track positions were excluded from  
96 the analysis to limit the across-track pixel width to about 40 km. Additional information on the OMI  
97 PCA  $\text{SO}_2$  product is available from Krotkov et al. (2016).

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## 100 2.2. $\text{SO}_2$ emission estimates

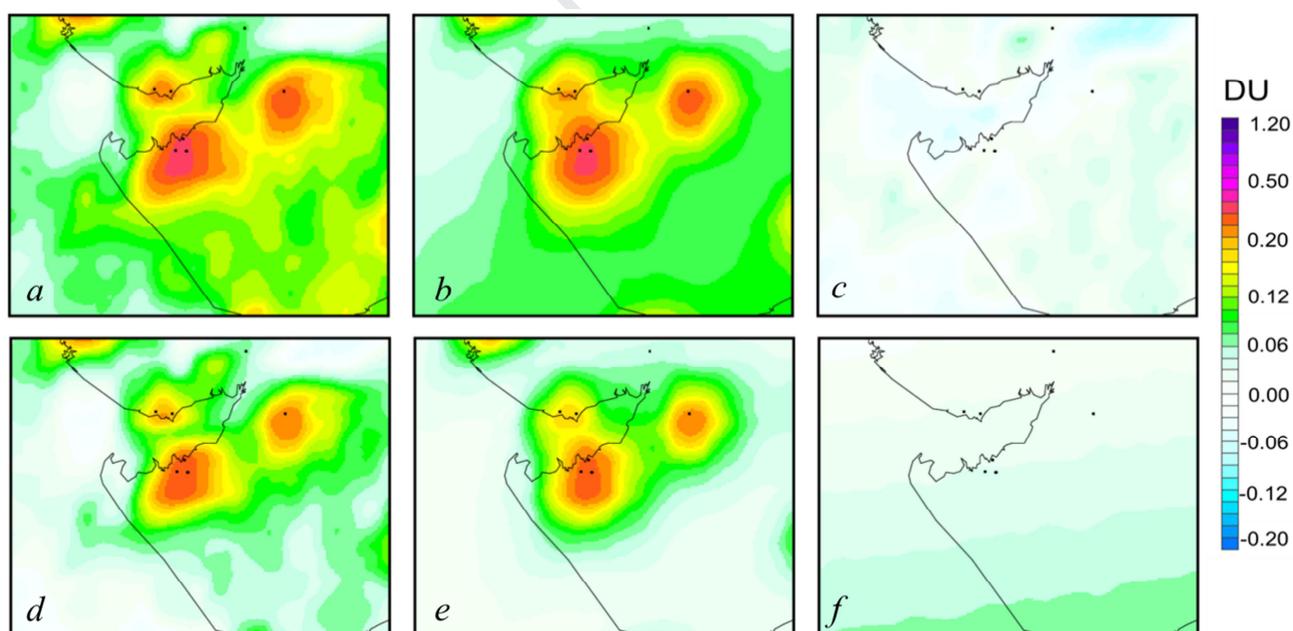
101 The OMI “top-down”  $\text{SO}_2$  emission estimates used in this study are based on the multisource fitting  
102 algorithm of Fioletov et al. (2017).  $\text{SO}_2$  values for each OMI pixel are merged with wind speed and  
103 direction from European Centre for Medium-Range Weather Forecasts (ECMWF) reanalysis data (Dee  
104 et al., 2011; <http://apps.ecmwf.int/datasets/>). Wind profiles are available every 6 h on a  $0.75^\circ$  horizontal  
105 grid and are interpolated in space and time to the location of each OMI pixel center. The algorithm is  
106 based on fitting OMI  $\text{SO}_2$  VCD data by a linear combination of functions of OMI pixel coordinates and  
107 wind speeds, where each function represents the plume from an individual source. It is assumed that the  
108 plume shape is the same for all sources and only the emission strength varies from source to source. The  
109 estimated total  $\text{SO}_2$  mass ( $\alpha$ ) for each source is related to the emission strength ( $E$ ). Assuming a steady  
110 state, these quantities are related through the equation  $E = \alpha/\tau$ , where  $\tau$  is the lifetime or, more  
111 accurately, decay time. The parameter  $\tau=6$  hours was estimated from OMI data based the observed  
112 plume decay. This makes it possible to estimate emissions from these sources or groups of sources. If  
113 the location of all sources is known, it is expected that the fitting results and the actual averaged OMI  
114 data will agree within the measurement noise level (about 0.5 DU for individual pixels). It was  
115 demonstrated that the algorithm can successfully estimate emissions for the power plants in the eastern  
116 U.S., Canada and Europe (Fioletov et al., 2017). The overall uncertainty of the method is about 50%.  
117 There are several factors that contribute to the emission estimate uncertainty, however the major  
118 contributors, namely uncertainties in air mass factors (i.e., related to the optical path length through the  
119 atmosphere) and  $\tau$ , appear as scaling factors. They affect emission estimates for the sources discussed in  
120 this study in the same way. In other words, even if the absolute emissions estimates may have large  
121 uncertainties, relative changes in emissions with time as well as the relative emission strength between  
122 the sources are far more accurate. The remaining factors, such as the uncertainty related to statistical  
123 errors from the regression model and errors due to incorrect wind speed and direction are about 20%.

124 Note that the error bars in this study represent the statistical uncertainties. Additional information about  
125 the algorithm and uncertainty analysis can be found in (Fioletov et al., 2016).

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127 It was also demonstrated that OMI data are affected by large-scale biases that are likely related to  
128 imperfection in the removal of a very strong ozone absorption that depends on stratospheric temperature  
129 and the ozone profile. Although such large-scale biases in the OMI PCA data set are relatively small,  
130 they nonetheless can affect emission estimates. Over the Eastern U.S., a 6<sup>th</sup> order polynomial function  
131 was added to the fit to account for this large scale bias (Fioletov et al., 2017) but in this study, the  
132 analysis was performed for a much smaller area and a linear function (of latitude and longitude) was  
133 used to account for the bias that appears as a north-south gradient. The method is illustrated by Figure 1,  
134 where the 2005-2017 mean OMI SO<sub>2</sub> data, the fitting results, the large-scale bias, and the difference  
135 between OMI data and the fitting results (the residuals) are shown. The emission sources included in the  
136 fit are shown by the black dots. As Figure 1 shows, OMI data with the bias removed (panels a and d)  
137 agree well with the fitting results (panels b and e), giving confidence in the emission estimates.

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140 **Figure 1.** (a) Mean SO<sub>2</sub> VCDs for 2005-2017 calculated from OMI data processed with the PCA  
141 algorithm. (b) Results of the fitting of OMI data by the set of functions that represent VCDs near  
142 emission sources using estimated emissions. A linear function of latitude and longitude was added to the

143 fit to account for a large-scale bias. (c) The difference between OMI data and the fitting results (the  
144 residuals). (d) OMI data with the large-scale bias removed. (e) The same as (b) but without the large-  
145 scale bias. (f) The estimated large-scale bias. The maps are smoothed by the pixel averaging technique  
146 with a 30-km radius (Fioletov et al., 2011). The main industrial sources are shown by the black dots.

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### 148 **3. Results & Discussions**

149 Over the past few years, ceramic tile consumption in India has increased due to the growth in average  
150 net worth of the population, a booming real estate sector along with a rapid increase in disposable  
151 income of consumers and growth in the infrastructure sector (Ernst & Young LLP, 2013). Increasing  
152 demand for ceramic products regionally and internationally resulted in an increase in ceramic  
153 production. Presently, ceramic industries in India produce ~12.9% (KICT, 2019) of global output, which  
154 places it second in the world. Morbi is the heart of India's ceramic industry, with a population of ~1/4  
155 of a million people located in the Rajkot district of Gujarat, India (Figure 2; Source 6), with over 600  
156 ceramic manufacturing units (mostly unorganized) (Care Ratings, 2019). Approximately 80% of India's  
157 ceramic industries/factories are located in Morbi, Gujarat, India, which are mostly engaged in ceramic  
158 tiles production (e.g., wall tiles, vitrified tiles, floor tiles, roofing tiles etc.) and accounts for ~70% of  
159 India's total production of ceramic tiles (Care Ratings, 2019).

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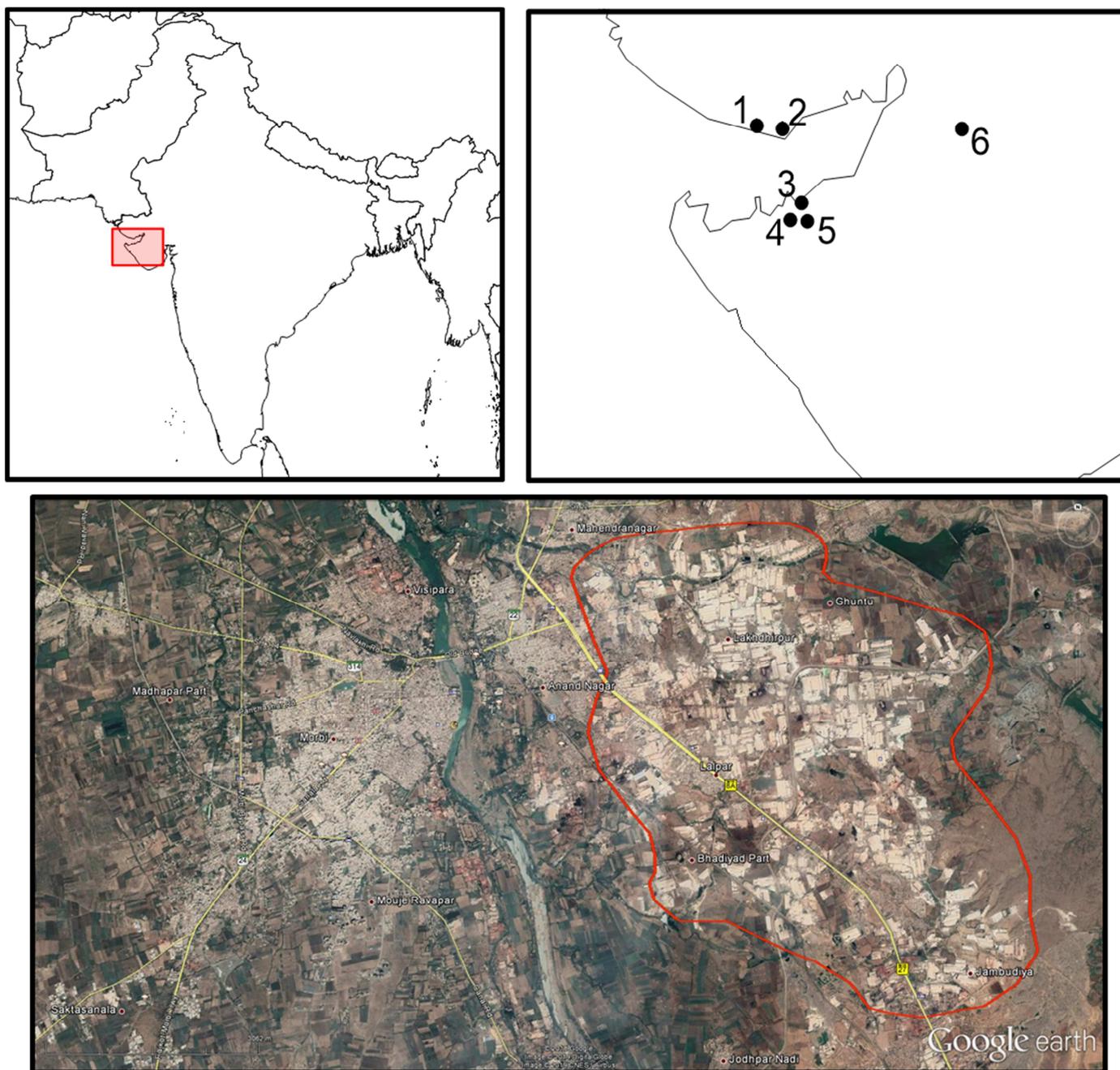
161 The Morbi cluster of ceramic factories expanded to  $\sim 7 \times 7 \text{ km}^2$  in area and is clearly noticeable towards  
162 the east side of Morbi city and marked with approximate boundary in red color on the Google Earth  
163 satellite image (Figure 2, bottom panel). The proximity to key raw materials (e.g. various type of clay,  
164 red and black soil, minerals such as calcite and wollastonite) for ceramic products either locally or from  
165 a neighboring state (e.g., Rajasthan) is one of the key reasons behind Morbi being the ceramic capital of  
166 India. Apart from Morbi, there is another large Indian ceramic cluster in Thangadh, located in the  
167 Surendranagar district of Gujarat, but it is not considered here because its emissions are substantially  
168 smaller.

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174 **Figure 2.** (Top left) The red square box region in Gujarat, India, analyzed in this study. (Top right) The  
 175 main industrial sites in the analyzed area: (1) Mundra Thermal Power Station (MTPS) and Mundra  
 176 Ultra-Mega Power Plant (UMPP), (2) Mundra Port, (3) Sikka Thermal Power Station, (4) Nayara  
 177 Energy Refinery (formally known as Essar Oil Refinery), (5) Jamnagar Oil Refinery, (6) Morbi, Gujarat,  
 178 India. The bottom plot is an expanded view of source (6), showing the ~7 km-wide ceramic industries  
 179 area within the red contour east of city of Morbi, Gujarat, India. The ceramic industries appear as white  
 180 rectangles on this Google Earth image.

181 In addition to ceramic factories at Morbi, India's second and third largest thermal power plants (namely,  
182 Mundra Thermal Power Station (MTPS) and Mundra Ultra-Mega Power Plant (UMPP)) (Power  
183 Technology, 2019), one of Gujarat's coal-fired power plant, and one of the world's largest oil refineries  
184 are located on the shores of the Gulf of Kutch (Figure 2) (World's largest refineries, 2016). Both, MTPS  
185 and UMPP are coal-fired thermal power plants and located very close to each other (~2 km apart), thus  
186 jointly considered as source 1 in Figure 1. The Mundra port (source 2, Figure 2) is the largest private  
187 port of India (Mundra Port, 2019). The Sikka Thermal Power Station (source 3, Figure 2), located near  
188 Jamnagar on the southern shore of Gulf of Kutch and operated by Gujarat State Electricity Corporation  
189 Limited (GSECL), is one of Gujarat's coal-fired power plant with two units of 250 MW (Sikka Thermal  
190 Power Station, 2019). The Nayara Energy refinery (formally known as Essar oil refinery; source 4,  
191 Figure 2) is India's second largest single site refinery located near Vadinar, Gujarat, with a capacity of  
192 405,000 barrels per day (64,400 m<sup>3</sup>/day) (Essar Refinery, 2019). Presently, the Jamnagar refinery  
193 (source 5, Figure 2) is the world's largest crude oil refinery owned and operated by Reliance Industries  
194 Limited, and located near Motikhavdi in Jamnagar district, Gujarat, India. It was commissioned in July  
195 1999 with an installed capacity of 668,000 barrels per day (106,200 m<sup>3</sup>/day) and later increased to  
196 1,240,000 barrels per day (197,000 m<sup>3</sup>/d) (Jamnagar Refinery, 2019).

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198 The large changes in land use / land cover, due to the rapid industrialization in Gujarat, India, can be  
199 seen in the LANDSAT satellite True Color Composites for 1984, 2005, and 2016  
200 (<https://earthengine.google.com/timelapse/>) (Figure 3). LANDSAT satellite images show large changes  
201 in the six industrial areas indicated in Figure 3. There were essentially no large industrial complexes in  
202 the six areas in 1984. By 2005 (the first year of OMI operation), Mundra port, Sikka Thermal Power  
203 station and the Jamnagar oil refinery in the Motikhavdi area were operational and some ceramic  
204 factories were seen near Morbi. The Essar oil refinery was still under construction in 2005, and  
205 completed and commissioned in 2006.

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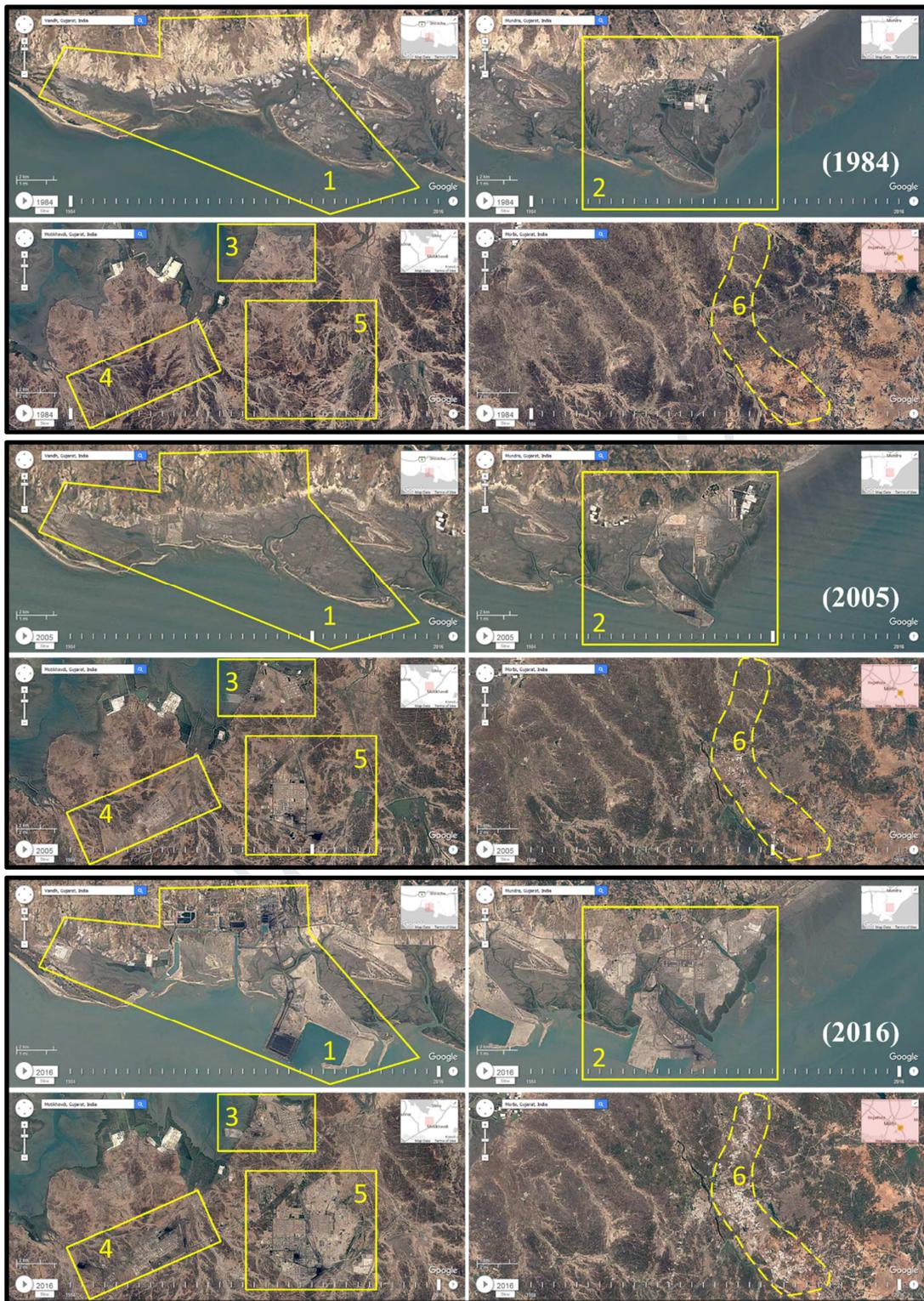
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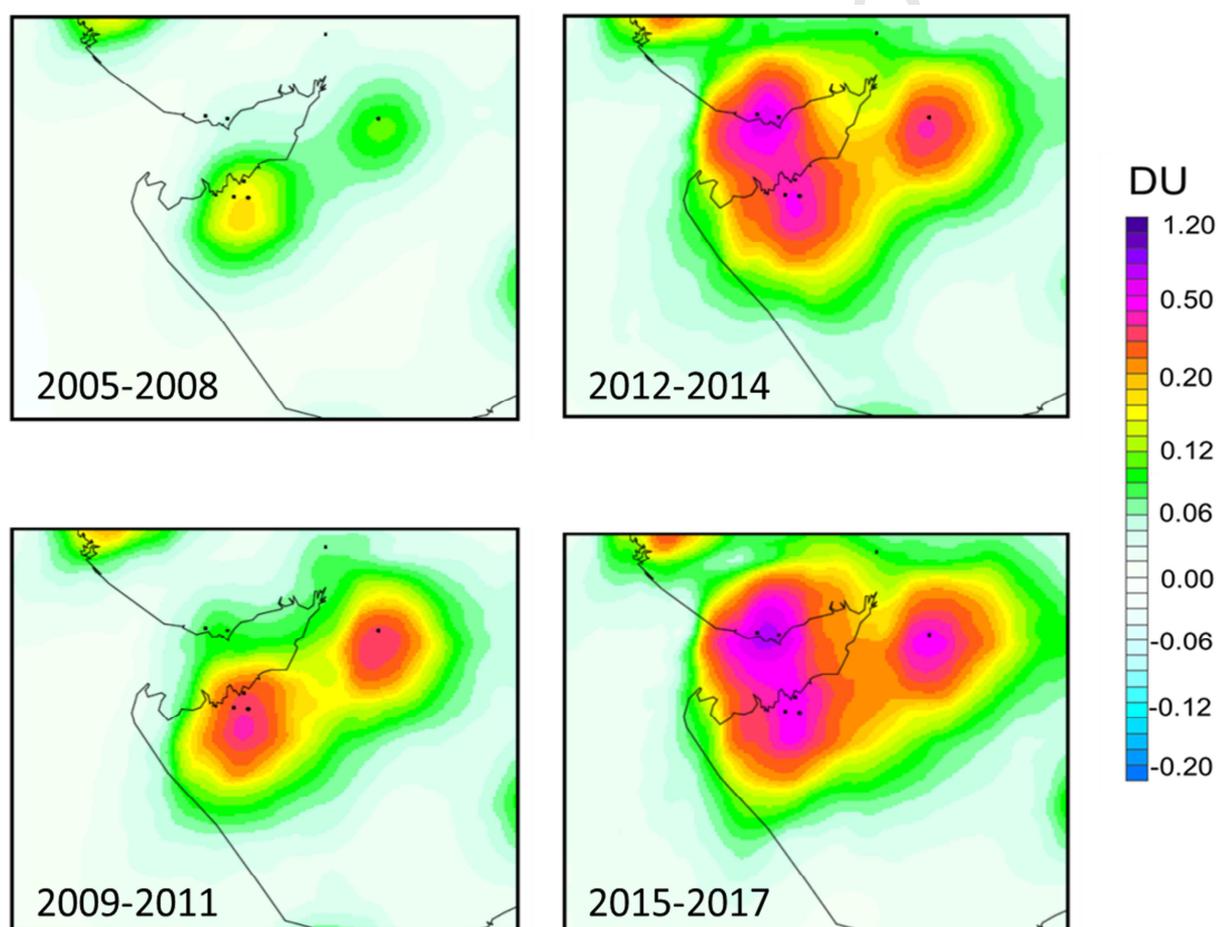
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234 **Figure 3.** LANDSAT True color composites over Vandh, Mundra, Motikhavdi and Morbi, Gujarat,  
 235 India for the period of 1984, 2005, and 2016. The main industrial areas, as labeled in Figure 2, are  
 236 shown in each panel.

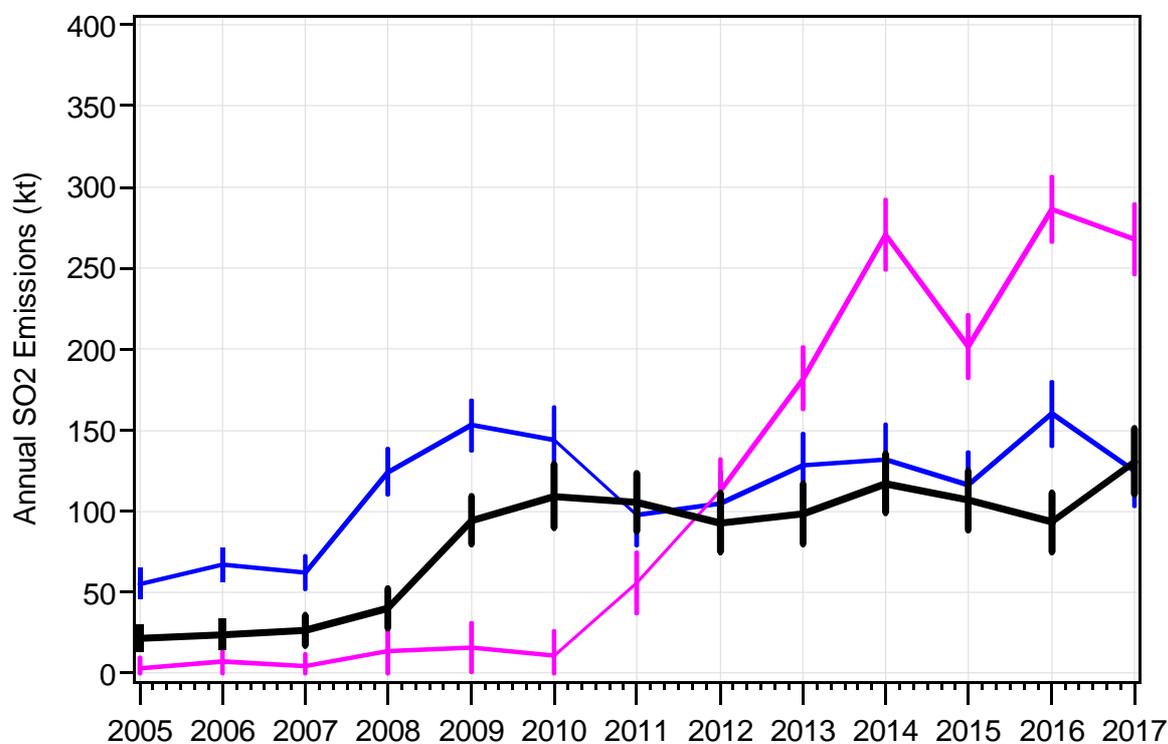
237 However, there was no sign of any construction activity at source 1 (i.e., MTPS and UMPP). In the  
238 bottom image for 2016, there are large industrial installations in all six areas. The construction for  
239 MTPS project began in 2008 and became fully operational in March 2012 with all nine units providing  
240 4620 MW (4 units of 330 MW and 5 units of 660 MW) capacity (Power Technology, 2019). The first  
241 330 MW and last 660 MW units of MTPS were commissioned in May 2009 and March 2012,  
242 respectively (Power Technology, 2019). Similarly, the construction for Mundra UMPP project began in  
243 2007 and became fully operational in March 2013 with all five units providing 4000 MW (each of 800  
244 MW) capacity (Power Technology, 2019). The expansion of the ceramic industrial cluster at Morbi,  
245 Gujarat is also evident in 2016.



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247 **Figure 4.** Mean OMI-derived SO<sub>2</sub> vertical column densities (VCDs) without the large-scale bias over  
248 Morbi, Gujarat, India, for the four periods as indicated on the plot. The main industrial sources are  
249 shown by the black dots.

250 Figure 4 shows the results of the fitting of OMI data by the set of functions that represent VCDs near  
 251 emission sources using estimated emissions with the large-scale bias removed (the plot corresponds to  
 252 the panel e of Figure 1). Satellite data from OMI clearly demonstrate a strong increase in SO<sub>2</sub> VCDs  
 253 over Gujarat (Figure 4) that reflect an increase in emissions (discussed below). In 2005-2008, only some  
 254 relatively weak SO<sub>2</sub> signals from the Jamnagar oil refinery at Motikhavdi and the Morbi ceramic cluster  
 255 existed. That signal increased significantly by 2011. After 2011, elevated SO<sub>2</sub> VCDs were observed  
 256 north of the Gulf of Kutch as the operation of the MTPS and UMPP power plants had started. The SO<sub>2</sub>  
 257 VCDs increased over Morbi due to the expansion of ceramic cluster.



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261 **Figure 5.** Annual SO<sub>2</sub> emissions for the three main industrial regions estimated from OMI data. The  
 262 magenta line indicates emissions from the sources 1 and 2, the blue line represents the sources 3, 4, and  
 263 5, and the black line demonstrates emissions from the ceramic industry (source 6) at Morbi (see Figure 2  
 264 for source locations). The error bars represent 95% confidence intervals.

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266 The data fitting algorithms can be used to estimate SO<sub>2</sub> emissions from individual factories or groups of  
267 factories located in close proximity ( Fioletov et al., 2017). Figure 5 shows the estimated annual  
268 emissions from three clusters of SO<sub>2</sub> sources. The sources within each cluster are located within 10-15  
269 km distance and the OMI spatial resolution is not fine enough to distinguish them as individual source.  
270 Therefore, we combined sources 1 and 2 as cluster 1, sources 3, 4 and 5 as cluster 2 and source 6 as  
271 cluster 3. The extensive use of ceramic products as structural materials and for decorative purposes in  
272 buildings has dramatically increased manufacturing in recent years (Sawdust, 2019), which has  
273 increased SO<sub>2</sub> emissions as shown in Figure 5. We found that emissions from Morbi ceramic industries  
274 have been near or above 100 kt y<sup>-1</sup> since 2009. They are now comparable with the sum of emissions  
275 from sources in cluster 2 (i.e., Sikka Thermal Power Station (source 3), Essar oil refinery (source 4) and  
276 Jamnagar refinery (source 5)) and represent ~half of the total emissions from sources in cluster 1 (i.e.,  
277 MTPS and UMPP (source 1) and Mundra port (source 2)). The SO<sub>2</sub> emissions from ceramic industries at  
278 Morbi are ~5 times higher in 2017 compared to 2005. The emissions from cluster 1 are ~2.75 times  
279 higher in 2017 compared to 2012, and cluster 2 are ~2.5 times higher in 2017 compared with 2005.

280  
281 We examined global emissions inventories, such as Hemispheric Transport of Air Pollutants (HTAP)  
282 (Janssens-Maenhout et al., 2015), Emissions Database for Global Atmospheric Research (EDGAR,  
283 Janssens-Maenhout et al., 2013) and the MACCity inventory (Lamarque et al., 2010; Granier et al.,  
284 2011) and none of them report any significant SO<sub>2</sub> emissions from the grid cell closest to the Morbi  
285 area. While emission estimates for the ceramic industries near Morbi are not available, there are  
286 estimates of SO<sub>2</sub> emissions for MTPS. A recent study by Tong et al. (2018) estimated that SO<sub>2</sub>  
287 emissions from one of MTPS's power-generating units, of 330 MW capacity, were ~7.9 kt per year in  
288 2010. As mentioned above, there were nine operational units in 2012 (4 units of 330 MW and 5 units of  
289 660 MW) (Power Technology, 2019). This suggests that MTPS's SO<sub>2</sub> emissions were ~110.6 kt per year  
290 in 2012, which is in line with OMI-based estimates (~110 kt y<sup>-1</sup> ± 25 kt y<sup>-1</sup>).

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292 While in this study we focused on Gujarat, India, there are other regions in the world with a high  
293 concentration of ceramic industries. For example, the total production of the ceramic industry in the  
294 Foshan region of China is even larger than in Morbi (3.3 ([http://www.recocera.com/ceramic-tile-](http://www.recocera.com/ceramic-tile-production-base/)  
295 [production-base/](http://www.recocera.com/ceramic-tile-production-base/)) and 2.8 million square meter tiles per day  
296 (<https://www.morbiceramicindustry.com/index.html>) respectively). However, these Chinese ceramic

297 industries are in close proximity to power plants, which makes it impossible for OMI to separate  
298 emissions from ceramic industries and power plants there.

299

#### 300 **4. Conclusions**

301 India's ceramic industry is an important source of anthropogenic SO<sub>2</sub> emissions that is not accounted for  
302 in common emissions inventories. Increase in India's population and rapid movement of dwellers from  
303 villages and towns to cities for job/livelihood is creating more demand for ceramic products, which is  
304 providing an additional growth opportunity for ceramic industries. In the absence of any other  
305 information, emission from the Morbi region, where about 80% of Indian ceramic industries are located,  
306 can be estimated using satellite data. They are computed to be ~100 kt y<sup>-1</sup> since 2009, which is  
307 comparable with emissions from a large power plant or oil refinery. Since there are ~600 ceramic  
308 factories in the Morbi ceramic cluster, on average each coal-based ceramic factory emits ~0.17 kt of SO<sub>2</sub>  
309 per year. Since there is an additional ~20% ceramic production outside of the Morbi region, one would  
310 expect an additional ~20 kt y<sup>-1</sup> in SO<sub>2</sub> emissions for a national total emission estimates of ~120 kt y<sup>-1</sup>.  
311 These new satellite-derived estimates can be used to help make more informed decisions on impacts of  
312 SO<sub>2</sub> emissions from the ceramic industries, as well as from oil refineries and power plants, on  
313 environment and human health. For example, these new satellite estimates can be used to monitor the  
314 impact of policy regulations such as those recently (March 9<sup>th</sup>, 2019) issued by Gujarat Pollution  
315 Control Board (GPCB) to close Morbi based ceramic units that are running on coal gasifiers following  
316 the National Green Tribunal order (Daily News and Analysis, 2019; The Times of India, 2019).

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319 We acknowledge the National Aeronautics and Space Administration (NASA) for the availability of  
320 OMI SO<sub>2</sub> tropospheric column data. The data used in this study can be made available on request  
321 (Shailesh K. Kharol and V. Fioletov, Environment and Climate Change Canada).

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335 products  
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**Highlights:**

- First satellite estimates of SO<sub>2</sub> emissions from India's Morbi ceramic industry.
- SO<sub>2</sub> ceramic emissions are similar to those from large refineries and power plants.
- Morbi ceramic SO<sub>2</sub> emissions are ~5 times higher in 2017 compared to 2005.

Journal Pre-proof

**Declaration of interests**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

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