

# GLOBAL MONITORING OF VOLCANIC SO<sub>2</sub> DEGASSING USING SENTINEL-5 PRECURSOR TROPOMI

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## ABSTRACT

We present here the TROPOMI SO<sub>2</sub> product, which is publicly available since April 2018. We describe the capabilities and limitations of the product for the monitoring of volcanic SO<sub>2</sub> degassing. With several examples, we illustrate the benefit of a small satellite pixel of 3.5 x 5.5 km<sup>2</sup>. Owing to its improved detection limit, the data can be used to generate time series of SO<sub>2</sub> mass over number of volcanoes, with a large range of SO<sub>2</sub> emissions. We use Nyiragongo as a show case and correlate the SO<sub>2</sub> mass data with lava lake level estimates and local measurements of the seismicity. This paper also presents on-going developments to further improve the performance of the product for weak SO<sub>2</sub> loadings using a new algorithm, COBRA.

**Index Terms**—volcanic emissions, sulfur dioxide, monitoring, time series, satellite.

## 1. INTRODUCTION

Measurement of sulfur dioxide (SO<sub>2</sub>) degassing is key for monitoring volcanic activity and, when used in conjunction with other types of measurements (e.g. of the seismicity, thermal emissions, ground deformation, etc.), for understanding volcanic processes. In this context, space-based measurements of SO<sub>2</sub> are particularly useful owing to their unlimited access to remote or poorly monitored volcanoes, or during large eruptions when ground-based infrastructures are typically overwhelmed. Over the last four decades, global satellites have been increasingly used to monitor and quantify volcanic SO<sub>2</sub> emissions, in particular from ultraviolet sensors [1]. Since April 2018, the Tropospheric Monitoring Instrument (TROPOMI)

provides open-access information on SO<sub>2</sub> worldwide with a daily revisiting time (see <http://www.tropomi.eu/>). Owing to its high spatial resolution of 3.5 x 5.5 km<sup>2</sup> (compared to previous UV sensors) and its good sensitivity in the lower troposphere, TROPOMI is uniquely positioned to detect weak volcanic SO<sub>2</sub> degassing emissions at the global scale (Figure 1). Moreover, recent studies [2,3] have shown that the analysis of high-resolution downwind patterns from TROPOMI bears important information on emission/eruption chronology at high temporal resolution, which were not available from any other satellite sensors.

In this paper, we present the TROPOMI SO<sub>2</sub> algorithm and illustrate the strengths of the product for monitoring volcanic SO<sub>2</sub> degassing via several examples. We give compact information on how to use the product and also highlight its main limitations. Finally, we present on-going efforts to improve the TROPOMI SO<sub>2</sub> algorithm with a new and highly sensitive scheme.

## 2. METHODOLOGY

The TROPOMI instrument [4] operates onboard the Sentinel-5 Precursor platform, the first Sentinel mission dedicated to the atmosphere. The satellite flies on a polar sun-synchronous orbit, crossing the equator at 13:30 local time. Owing to its large orbital swath of 2600 km, global coverage is achieved in nearly one day. TROPOMI has a resolution as good as 3.5 x 5.5 km<sup>2</sup>. The instrument measures solar light backscattered from the atmosphere and reflected by the Earth in eight spectral bands covering the ultraviolet to shortwave infrared wavelengths. The operational retrieval of the SO<sub>2</sub> vertical column amount (i.e. total number of molecules per unit area) is performed in the ultraviolet (band 3) following a

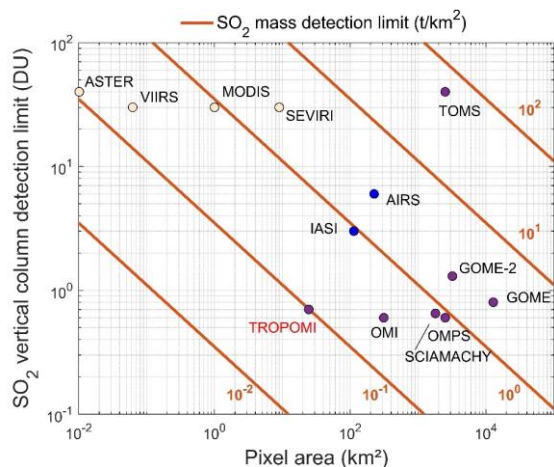


Figure 1. SO<sub>2</sub> vertical column detection limit (at 3- $\sigma$  level) expressed in Dobson Unit (1DU=2.69x10<sup>16</sup> molec/cm<sup>2</sup>) for a tropospheric plume at 3 km height, as a function of pixel size (in km<sup>2</sup>) for space nadir sensors with proven capability to detect SO<sub>2</sub>. The orange lines are SO<sub>2</sub> mass detection limit iso-lines. Figure adapted from Theys et al. (2019).

Differential Optical Absorption Spectroscopy (DOAS) algorithm, described in details elsewhere [5]. In brief, the algorithm includes three main steps:

1. Wavelength calibration and spectral fitting: the spectral analysis of the measured intensities yields the SO<sub>2</sub> absorption strength, the so-called slant column density (i.e., the SO<sub>2</sub> concentration integrated along the light path). By default, the retrieval is done in the range 312-326 nm but to avoid possible saturation effects, two alternative windows (325-335 nm or 360-390 nm) are also considered for strong SO<sub>2</sub> signals.
2. Background correction: this step is needed to correct biases and across-track dependencies in the data.
3. Air Mass Factor (AMF) calculation: to convert slant columns into vertical columns, scaling factors (AMFs) are needed to account for the radiative transfer in the atmosphere. The AMF depends on the SO<sub>2</sub> vertical distribution, which is unknown. The AMF (and vertical column) is calculated for three hypothetical plume heights at 1, 7 and 15 km. For a certain volcanic event, it is up to the user to select the column with a representative height or to interpolate the three columns for a given plume height (estimated from independent sources).

For volcanic studies, the SO<sub>2</sub> mass is usually preferred over the SO<sub>2</sub> vertical column. Knowing the TROPOMI pixel spatial dimensions, the conversion to the SO<sub>2</sub> mass is straightforward and the total mass loading for a given day and geographical region can be obtained by summing the mass values of the pixels belonging to the volcanic plume. For this, it is handy to use the SO<sub>2</sub> detection flag (included in the files) to delineate the plume. Note however that at high-latitudes, the TROPOMI orbits are partly overlapping and, to avoid double counting, a common practice (in particular for large eruptions) is to grid the data and then estimate the total mass from the SO<sub>2</sub> mass value in each tagged grid cell. Finally, it should be emphasized that a more robust and geophysical quantity than the total SO<sub>2</sub> mass is provided by the SO<sub>2</sub> emission rate (in ton day<sup>-1</sup> or kg s<sup>-1</sup>). The later can be inferred from satellite SO<sub>2</sub> measurements using several techniques [1-3, 6] that usually combine satellite data with meteorological wind field information. This is however out of the scope of this paper.

### 3. RESULTS

The TROPOMI SO<sub>2</sub> product proves to be very useful for volcanic surveillance and near-real-time applications, such as the Support to Aviation Control Service (SACS; sacs.aeronomie.be) [7]. Figure 2 shows an example of an SO<sub>2</sub> plume injected at flight altitudes as observed by TROPOMI. The high-resolution mapping of SO<sub>2</sub> is a clear asset for simulating and forecasting the plume dispersion (and its many filaments) as the data essentially carries time- and height-resolved information on the source.

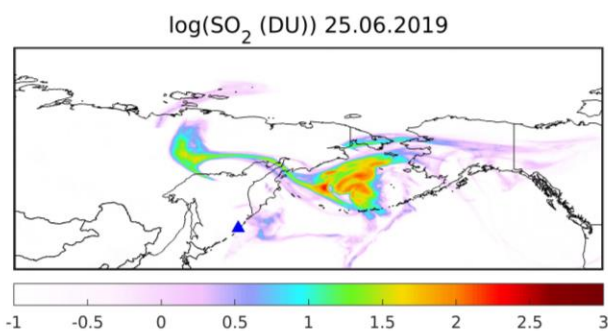


Figure 2. TROPOMI SO<sub>2</sub> vertical column (in logarithmic scale) on 25 June 2019, after the massive eruption of Raikoke (blue triangle). The total SO<sub>2</sub> mass is 1.27 Tg, assuming 15 km plume height.

We note however that errors in the retrieved SO<sub>2</sub> columns are rather frequent for fresh or high SO<sub>2</sub> plumes and are mostly due to the presence of large amounts of aerosols and limitations in the fitting windows transition [5].

Moving from large to much lower SO<sub>2</sub> emissions, Figure 3 shows an example of SO<sub>2</sub> column map over Chile-Argentina. Although the observed SO<sub>2</sub> is close to the noise level, an SO<sub>2</sub> plume originating from the Copahue volcano is clearly visible; the total SO<sub>2</sub> mass is of ~ 0.031 kt. Note that, compared to other UV sensors (like OMI), this particular SO<sub>2</sub> plume is only observed by TROPOMI and illustrates the improved detection limit of the instrument.

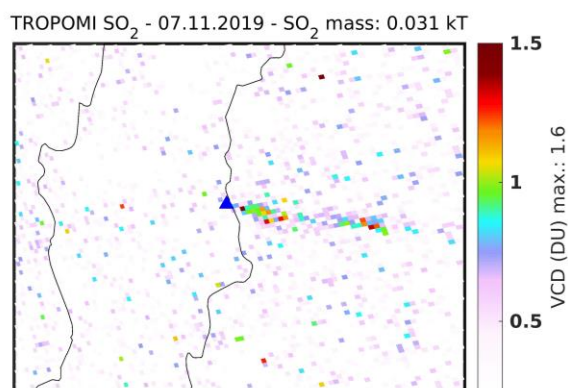


Figure 3. TROPOMI SO<sub>2</sub> vertical column on 07 November 2019. An SO<sub>2</sub> plume can discerned from the Copahue volcano (blue triangle). The total SO<sub>2</sub> mass is 0.031 kt, assuming 7 km plume height.

As an illustration of SO<sub>2</sub> mass time-series, Figure 4 shows the time evolution of the SO<sub>2</sub> emissions over Nyiragongo (Democratic Republic of Congo, DRC) measured by TROPOMI for one year. Nyiragongo is hosting a large lava lake, and its flank eruptions constitute a serious threat to the local populations (e.g., of the city of Goma). Therefore, active research and continuous monitoring of the activity of the volcano are very important. In Figure 4, the TROPOMI SO<sub>2</sub> mass estimates are confronted to data of the lava lake depth (obtained from SAR measurements [8]) and to the counting of deep seismic events [9]. As can be seen, the three largest SO<sub>2</sub> peaks in the TROPOMI data record are all directly connected to severe drops in the lava lake level, which are the consequence of deep magma intrusion events as deduced from the seismicity count below Nyiragongo (> 10 km depth b.s.l.). The increase of SO<sub>2</sub> emissions conveys here periods of

sudden stronger lava lake spattering activity following these pressure drops, which are also inferred from the detection of high amplitude infrasound tremors (i.e., continuous acoustic explosion signals) [8]. A more detailed analysis of the lava lake dynamics is out of the scope of this paper but the results in Figure 4 highlight the great benefit of high quality satellite SO<sub>2</sub> measurements to study volcanic activity in connection with other satellite and ground-based measurements, in particular for regions such as DRC where local infrastructures are hard to maintain.

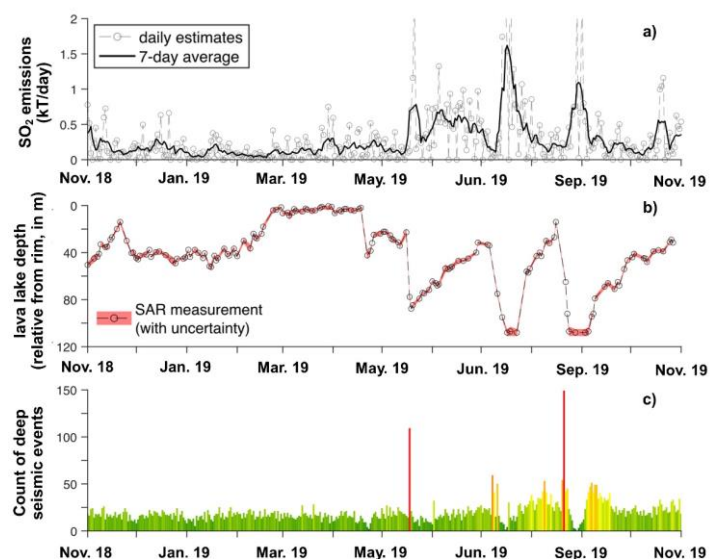


Figure 4. Time-series over Nyiragongo for Nov. 2018 - Nov. 2019 of (a) total daily SO<sub>2</sub> mass estimated with TROPOMI (assuming 4 km plume height), (b) lava lake depth from SAR measurements, (c) count of deep seismic events from seismic network (KivuSNet).

As a last example, we demonstrate here that TROPOMI also allows to study weaker volcanic SO<sub>2</sub> sources than those presented above. For this, it is common to average the data in time/space to reduce the data scatter. However, doing so is often not very successful because of local biases in the data. These are due to spectral misfits and are therefore not easy to correct. A new algorithm is under development that effectively suppresses the spectral interferences in the analysis. It is a Covariance-Based Retrieval Algorithm (COBRA) [10], which leads to very significant reductions of both the noise and biases in the data. As result, COBRA allows detecting very low volcanic emissions of SO<sub>2</sub> in long-term averaged data (as illustrated in Figure 5 over the Aleutian

Islands). This is a key step forward in terms of sensitivity, and will certainly enhance the use of TROPOMI for studying volcanic SO<sub>2</sub> emissions and trends.

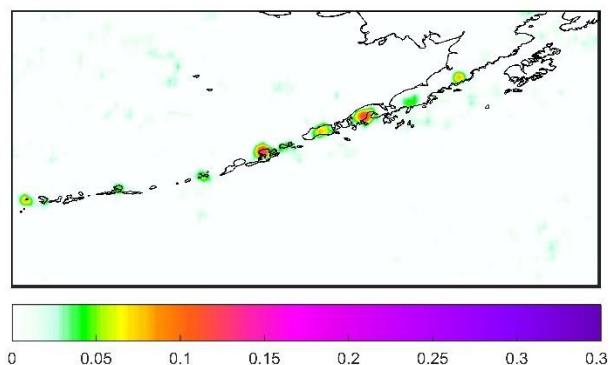


Figure 5. Detection of weak volcanic SO<sub>2</sub> sources in the Aleutian Islands (Alaska) by applying the TROPOMI COBRA schemes to two years of cloud-free observations (May 2018 - Avril 2020). The colors represent SO<sub>2</sub> column values in Dobson Units.

#### 4. CONCLUDING REMARKS

We presented here the TROPOMI SO<sub>2</sub> data set and illustrated the capabilities and limitations of the product to monitor volcanic SO<sub>2</sub> degassing with several examples. The high spatial resolution of the instrument allows to infer detailed information on SO<sub>2</sub> emissions and to detect weaker sources than with any other satellite instrument. Taking advantage of the high measurement sensitivity, we illustrate with the case of Nyiragongo how the SO<sub>2</sub> mass estimated by TROPOMI can be related to volcanic processes and complements other geophysical measured quantities.

In the future, we expect further exploitation of the TROPOMI SO<sub>2</sub> data for volcanic surveillance and near-real-time applications. This will be particularly relevant with highly sensitive algorithms like the COBRA, briefly introduced here. An important step forward will be also to retrieve systematically the SO<sub>2</sub> flux from TROPOMI daily SO<sub>2</sub> measurements at many volcanoes worldwide.

#### 5. ACKNOWLEDGEMENTS

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paper contains modified Copernicus data (2018/2020) processed by BIRA-IASB and DLR.

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