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Sentinel-4 Capabilities for Volcanic Emission Monitoring and ML-Enhanced Retrievals

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INTRODUCTION

Sentinel-4 is a new geostationary remote sensing instrument designed to provide high temporal resolution measurements of atmospheric composition over Europe. Installed aboard the Meteosat Third Generation – Sounder (MTG-S) satellites, it features a high-performance UV-VIS-NIR spectrometer that will deliver near-continuous observations of key atmospheric species, including trace gases and aerosols. Its combination of an 8 x 8 km² spatial resolution with hourly updates across the entire domain enables the detection of rapid atmospheric changes with unprecedented temporal continuity. These characteristics make Sentinel-4 particularly well suited for monitoring volcanic emissions. The frequent revisit cycle allows near-real-time tracking of sudden variations in SO₂ and ash concentrations, and supports improved analysis of plume formation, transport, and chemical evolution. Compared with current low-Earth-orbit missions, Sentinel-4 introduces a paradigm shift by coupling geostationary coverage with spectral bands traditionally employed for volcanic gas retrieval. The large volume of high temporal and spectral resolution data produced by Sentinel-4 also presents new challenges for processing and interpretation. Machine learning methods offer promising solutions for enhancing gas retrieval accuracy, accelerating operational workflows, and improving short-term forecasts of the dispersion of volcanic plumes. Here, we present an overview of the operational and scientific potential of Sentinel-4 mission for volcanic emission monitoring and provide a comparison with the TROPOMI sensor aboard Sentinel-5P. The analysis highlights how Sentinel-4 combines the temporal resolution advantages of geostationary platforms with the spectral capabilities of TROPOMI, offering new opportunities - further strengthened by machine learning techniques - for advanced monitoring and modelling of volcanic plumes.

SPATIAL, SPECTRAL AND TEMPORAL CHARACTERISTICS

Sentinel-4 provides continuous monitoring of air quality and trace gas emissions over Europe, North Africa, and parts of the Middle East from the Meteosat Third Generation platform. Its geostationary orbit enables hourly daytime observations, allowing near-real-time tracking of volcanic plumes. The instrument achieves a spatial resolution of ~8 x 8 km² (at nadir), suitable for monitoring regional-scale emission sources. Continuous coverage includes active volcanic regions such as Mount Etna and Stromboli, making Sentinel-4 particularly effective for observing persistent degassing and rapidly evolving eruptions.

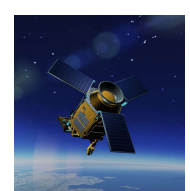
Table 1: Main design and performance parameters of SENTINEL-4

Parameter	UV-VIS values	NIR values	Comments
Wavelength range	305-775 nm	400-500 nm	Measurement of Resonance avoided by spectral pixel sampling
Spectral Resolution	0.5 nm	0.5 nm	
Spectral Channeling	1	1	
Spectral Calibration Accuracy	±0.01%	±0.01%	
Geometric and Temporal Coverage			
Orbit	Geostationary	Geostationary	
Spatial Sampling Distance (SSD)	8 km x 8 km	8 km x 8 km	On-ground projected 5000 x 5000 km ² coverage, ground air sampling (AS) at 1000 m resolution (1000 x 1000 m)
Imagined Energy	30% over 1.45E02W x 1.13E02W, 40% over 1.72E02W x 1.72E02W, 4.0%	30% over 1.45E02W x 1.13E02W, 40% over 1.72E02W x 1.72E02W, 4.0%	Integrated energy is necessary for the spectral resolution of the instrument.
SNR at 1000 nm	1000	1000	
1-sigma uncertainty & Radiance Coeff.	0.01%	0.01%	
Daily Earth observation time	See Fig. 1	See Fig. 1	
Spatial co-registration	See Fig. 1	See Fig. 1	Adjusted to seasonally varying water Earth illumination on specific bands
Parameter <th>UV-VIS values</th> <th>NIR values</th> <th>Comments</th>	UV-VIS values	NIR values	Comments
Spectral Bandwidth	0.5 nm	0.5 nm	End-to-end system-to-detector
Radiance Aperture	30 mm	44 mm	Circle diameter
Earth View	UV-VIS: 10000	NIR: 10000	For Earth radiance & reflection
Earth Albedo: RA	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RB	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RC	0.1	0.1	For Earth radiance & reflection
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Earth Albedo: RJ	0.1	0.1	For Earth radiance & reflection
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Earth Albedo: RQ	0.1	0.1	For Earth radiance & reflection
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Earth Albedo: RS	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RT	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RU	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RV	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RW	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RX	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RY	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RZ	0.1	0.1	For Earth radiance & reflection
Earth Albedo: RA	0.1	0.1	For Earth radiance & reflection
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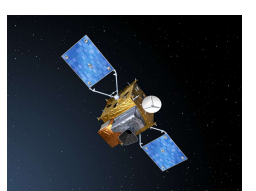


From a **spectral standpoint**, Sentinel-4 operates in the ultraviolet, visible, and near-infrared (UVN) spectral ranges, covering key absorption bands of key atmospheric trace gases such as SO₂, NO₂, O₃, and HCHO. Sentinel-4 features a UVN (Ultraviolet-Visible-Near Infrared) spectrometer covering ~305-400 nm (UV), 400-500 nm (Visible), and 750-775 nm (NIR), enabling the detection of key atmospheric species such as SO₂. Trace gas retrievals are based on the Differential Optical Absorption Spectroscopy (DOAS), which exploits narrow absorption features and requires high spectral resolution and accurate calibration. These spectral capabilities allow for reliable quantification of volcanic gas emissions and improved monitoring of degassing processes.

SENTINEL-4 vs SENTINEL-5 TROPOMI



Instrument	Technical Concept	Spectral Range (nm)	Spatial Resolution (km x km)	Coverage	Revisit Time	Orbit
TROPOMI	Push-broom (nadir-fixed)	UV-VIS-NIR-SWIR (270-2385)	7 x 7	Global	1 day	Polar
Sentinel-4	Push-broom (scanning)	UV-VIS-NIR (305-775)	8 x 8	Europe + parts of North Africa and the Atlantic	1 hour	Geostationary



VOLCANIC TRACE GAS OBSERVATIONS (S4)

Level-2 Product : Georeferenced Data And Calculated Atmospheric Parameters

SO₂

NO₂

O₃

Images provided by the European Space Agency (ESA)

Prospective Volcanic Gas and Aerosol Products

- SO₂ and NO₂ Column Densities
- Aerosol Optical Depth (AOD) and Particle Properties
- Plume Height and Transport
- Time-Series Analysis of Volcanic Emissions

INTEGRATION OF SENTINEL-4 DATA WITH AI TECHNIQUES

Daily TROPOMI SO₂ emissions monitoring^[1]

Useful for tracking trends but **limited** for capturing rapid variations during **effusive** recent activity of Mount Etna (December 2025 - January 2026).

Developed by the **TECHNOLAB** group of INGV-OE (<https://www.ct.ingv.it/tecnolab/volchazard>)

Compared to TROPOMI, **Sentinel-4 will allow monitoring of Etna's SO₂ emissions on an hourly basis, capturing rapid variations that daily data cannot detect.**

[1] Corradino, C.; Ianni, F.; La Spina, A.; Del Negro, C. Monitoring Earth's atmosphere with Sentinel-5 TROPOMI and Artificial Intelligence: Quantifying volcanic SO₂ emissions. Remote Sens. Environ. 2024,111, 114663

Workflow for a potential ML algorithm application

INPUT DATA AND FEATURE EXTRACTION

- SO₂ VCDs from Sentinel-4
- Spatial textural features
- High-temporal-resolution stacks

Machine Learning Techniques

Random Forest Classifier

Post-Processing

SO₂ Detection Map

SO₂ QUANTIFICATION

$$m_{SO_2} = M(SO_2) \sum_{i=1}^N VCD_i \cdot A_i$$

where $M(SO_2)$ is the molar mass of SO₂ (64 g/mol), VCD_i represents the vertical column density of SO₂ for pixel i as measured by Sentinel-4, and A_i is the corresponding pixel area.

Future Works

- Simulating volcanic SO₂ dispersion with Sentinel-4 to analyze spectral, spatial, and temporal responses compared to other satellite sensors
- Applying artificial intelligence techniques to quantify SO₂ emissions using Sentinel-4 data

Find out more about our research:

ct.ingv.it/tecnolab/

Scan the QR code to leave feedback, ask a question, or just let me know you stopped by!

Conclusion

Sentinel-4 enables near real-time monitoring of volcanic emissions with high temporal and spectral resolution. Combined with satellite synergy and Machine Learning, it significantly improves plume tracking, gas retrievals, and our understanding of volcanic dynamics.

Acknowledge: this work was developed within the framework of the Laboratory of Technologies for Volcanology (TechnoLab) at the INGV in Catania (Italy).

[2] Guide, S. T.; Kelm, M. G.; Smith, D. J.; Maszer, R.; Bazzolatte, C.; Covington, L.; Lacroix, G.; Salskus, M.; & Bagrationi, G. (2014). Sentinel-4: a geostationary imaging UVN spectrometer for air quality monitoring - status of design, performance and development.