

# Volcanic SO<sub>2</sub> Height Retrieval From UV Satellite Measurements

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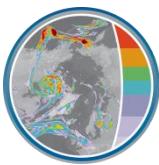
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<sup>3</sup>Aristotle University of Thessaloniki, Greece

<sup>4</sup>ECMWF/CAMS, UK

26 November 2021





# SO<sub>2</sub> column retrieval

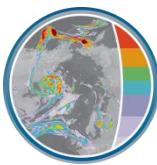
- Based on UV earthshine measurements:
  - Easy retrieval of SO<sub>2</sub> SCD (DOAS, PCA, etc)
  - Calculation of VCD via AirMassFactor (AMF)
- AMF requires assumption about SO<sub>2</sub> profile
  - Plume height unknown, depending on emission source & strength
- Operational products provide SO<sub>2</sub> VCDs for different eruption/emission scenarios
- E.g. S5p & GOME2 SO<sub>2</sub> product: **4 VCDs**
  - Explosive eruption (i.e. @15km)
  - Moderate eruption (i.e. @~7km)
  - Weak eruption & degassing (i.e. @~2km)
  - Anthropogenic pollution (i.e. @PBL)



Chart 2

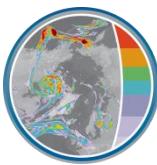


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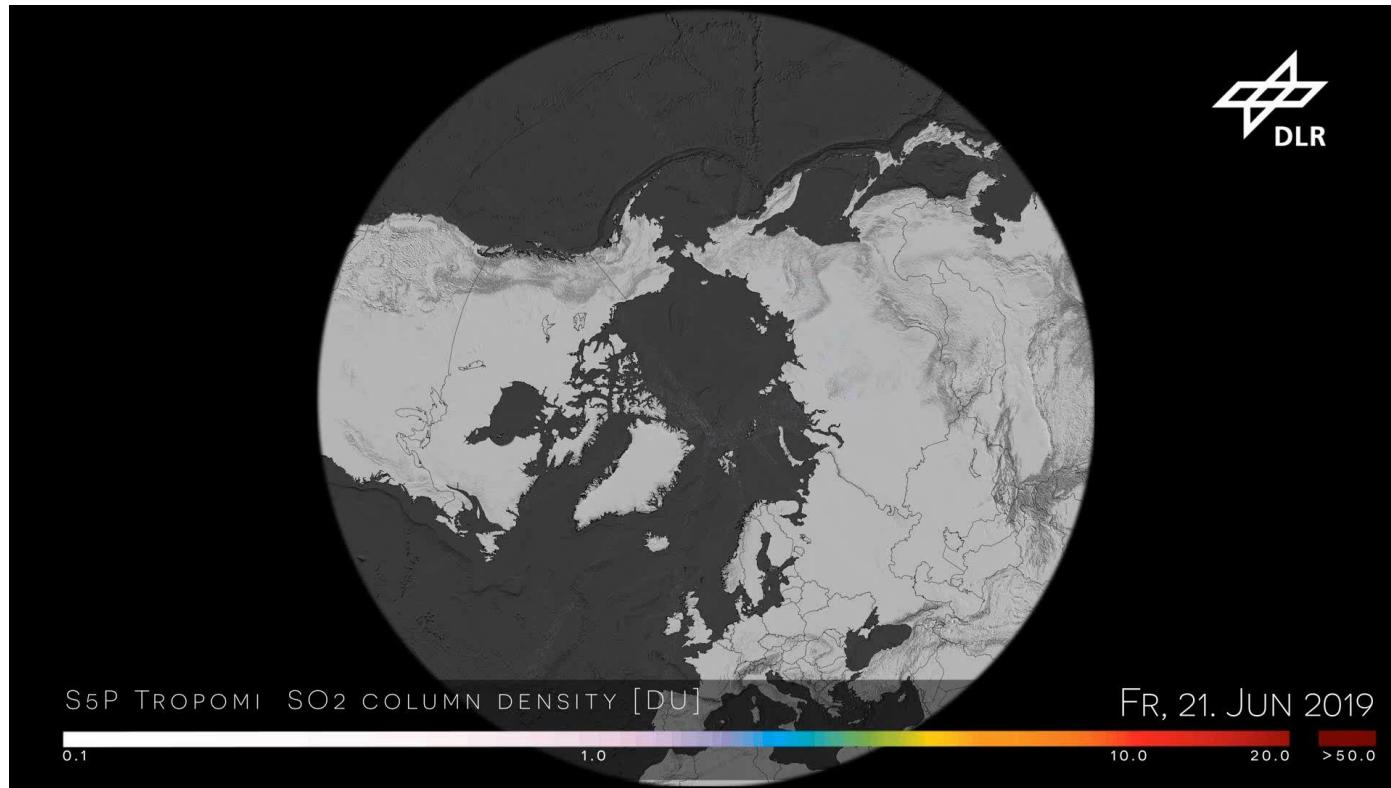


# SO<sub>2</sub> LH retrieval algorithm FP\_ILM: Full Physics Inverse Learning Machine

- Full-Physics Inverse Learning Machine (FP\_ILM)
    - Extremely fast and accurate UV SO<sub>2</sub> layer height retrieval
    - Combined PCA & NN algorithm
    - Processing speed: ~3ms / pixel (TROPOMI)
    - Accuracy: <2km (SO<sub>2</sub> VCD > 20 DU)
    - Easily applicable to any UV instrument (GEMS, S4, S5, ...)
      - Metop/GOME-2 (Efremenko et al. 2017)
      - S5p/TROPOMI (Hedelt et al. 2019)
      - AURA/OMI (Fedkin et al. 2020)
  - Optimized in framework of **ESA S5P+I: SO2LH** project
  - **DLR INPULS: Semi-operational NRT S5p SO<sub>2</sub> LH retrieval** every hour
    - Assimilated by ECMWF/CAMS
- D. Efremenko, et al. (2017): Volcanic SO<sub>2</sub> plume height retrieval from UV sensors using inverse learning machines IJRS, Vol 38
- P. Hedelt, et al. (2019): SO<sub>2</sub> Layer Height retrieval from Sentinel-5 Precursor/TROPOMI using FP\_ILM, AMT-2019-13, Vol. 12, No. 10
- N. M. Fedkin, et al. (2020): Volcanic SO<sub>2</sub> Effective Layer Height Retrieval for OMI Using a Machine Learning Approach, AMT, Vol14



# Raikoke eruption in June/July 2019



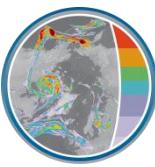
- Massive eruption on 21/22 June 2019
- High-altitude ash & SO<sub>2</sub> plume reaching stratosphere
- SO<sub>2</sub> plume detectable until September 2019



Chart 4

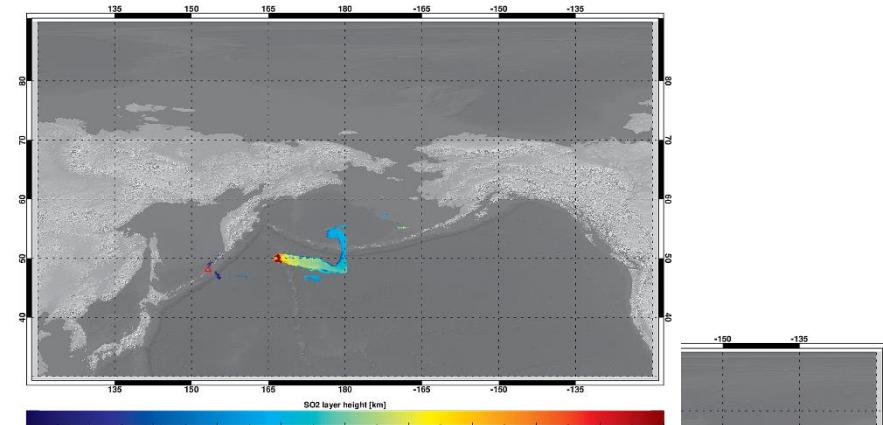


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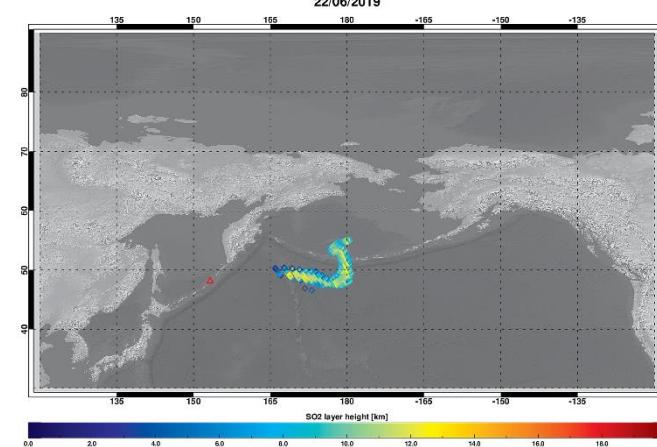


# Raikoke 2019: Comparison S5P LH vs OMI LH

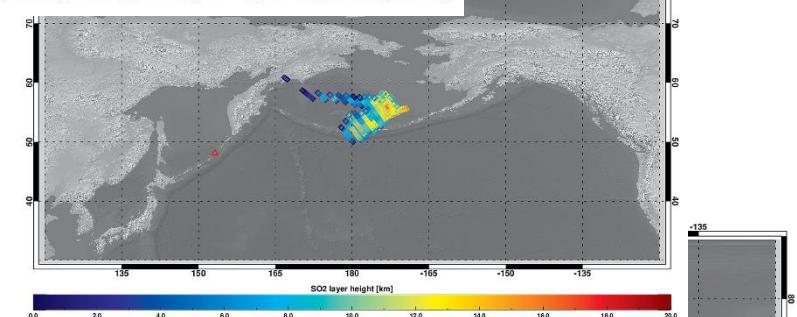
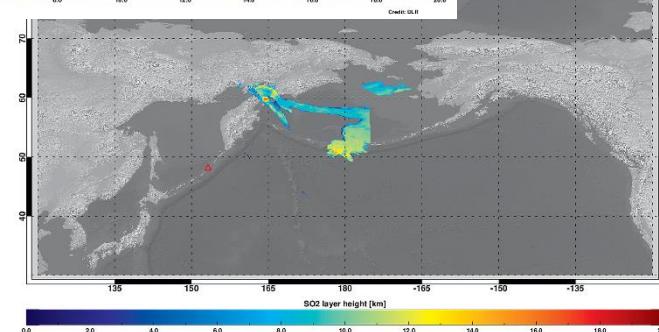
Sentinel-5 Precursor  
23/06/2019  
Raikoke



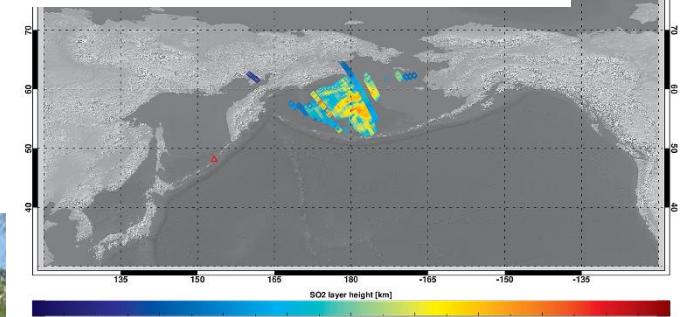
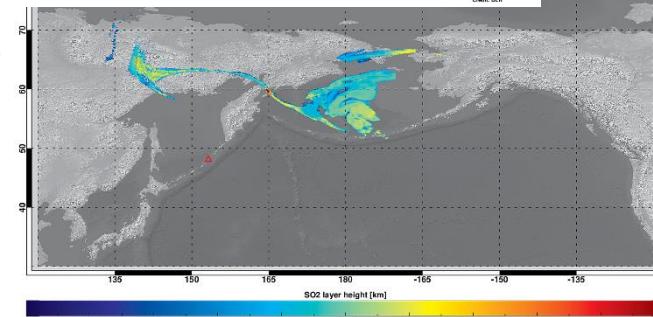
OMI  
Raikoke  
22/06/2019

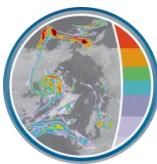


Credit: NASA/DLR

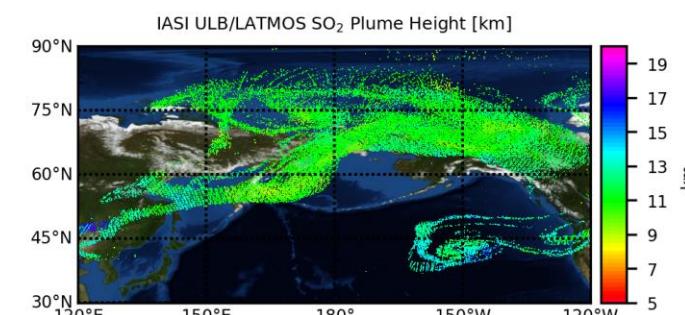
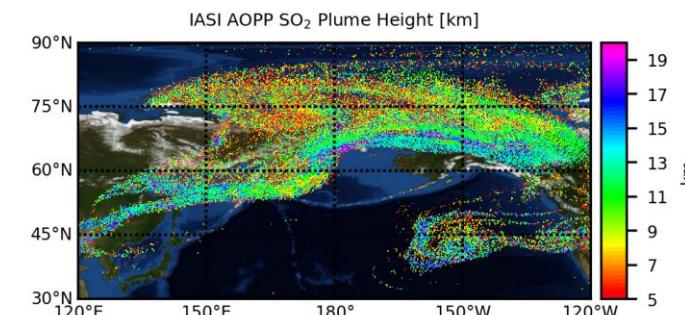
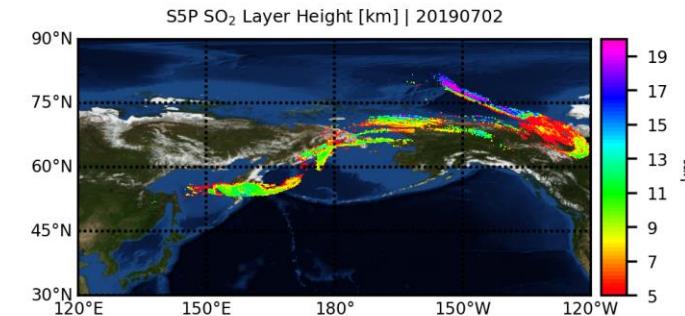
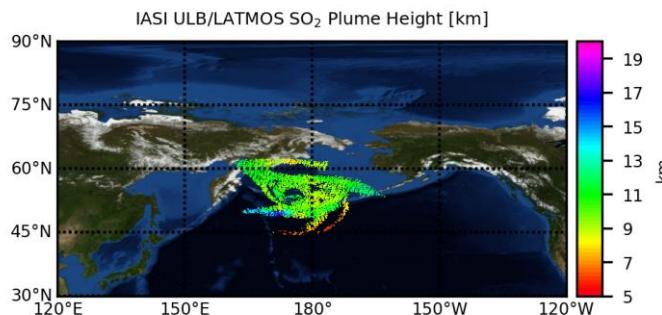
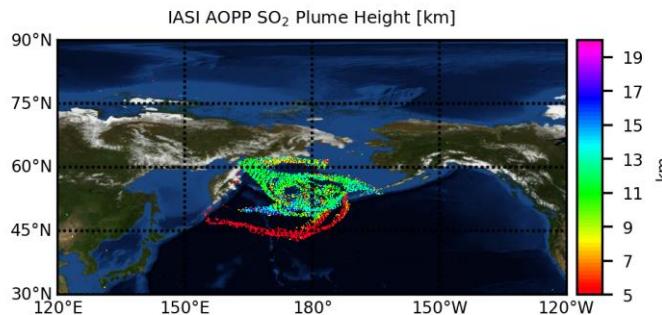
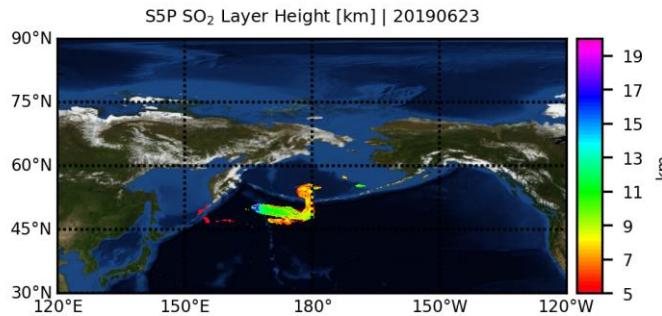


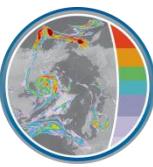
Credit: DLR/ESA



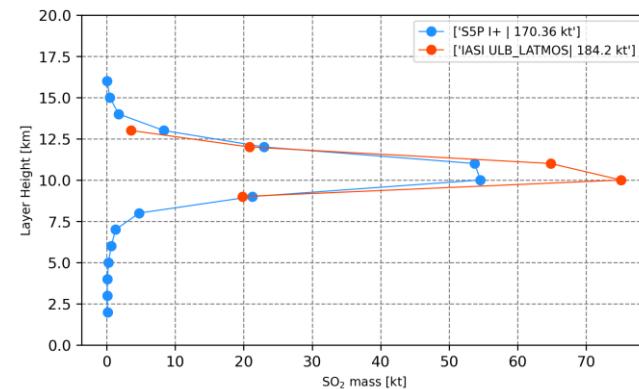
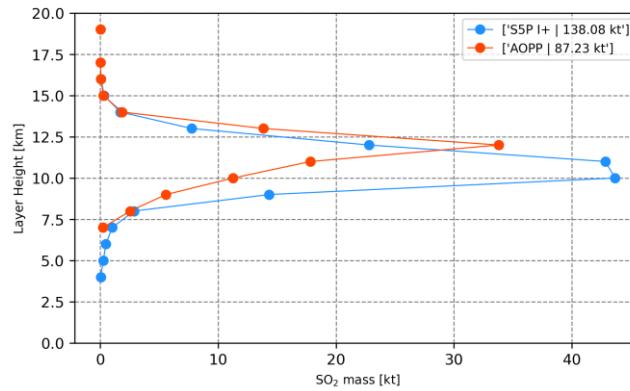
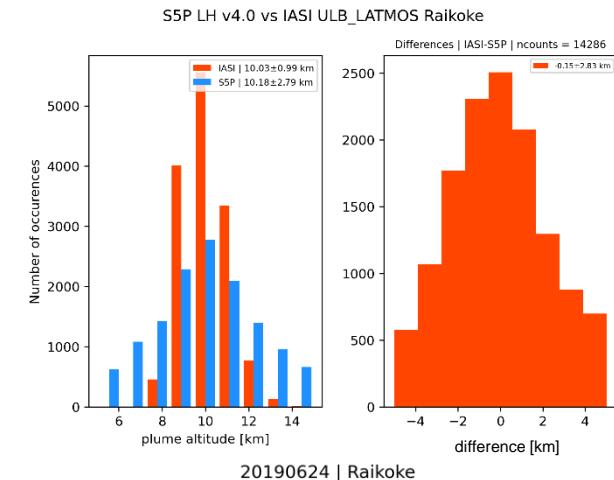
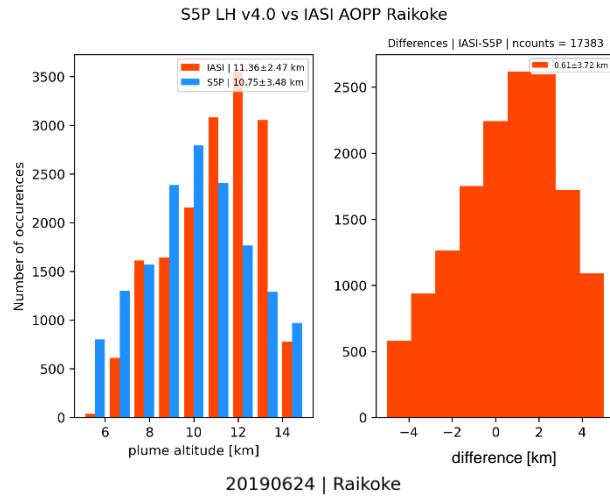


# Raikoke 2019: Validation against IASI SO<sub>2</sub> LH products

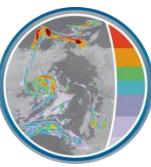




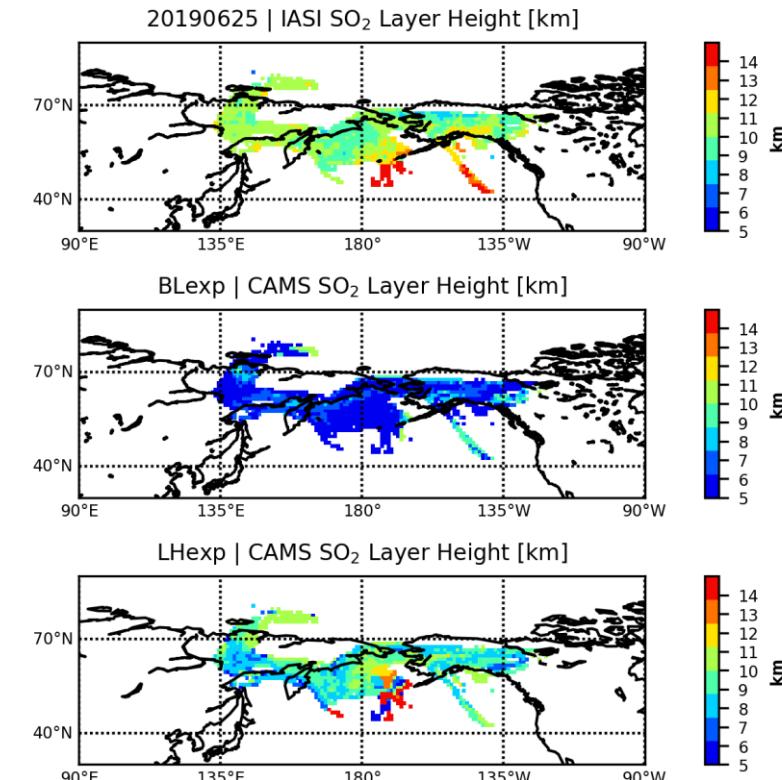
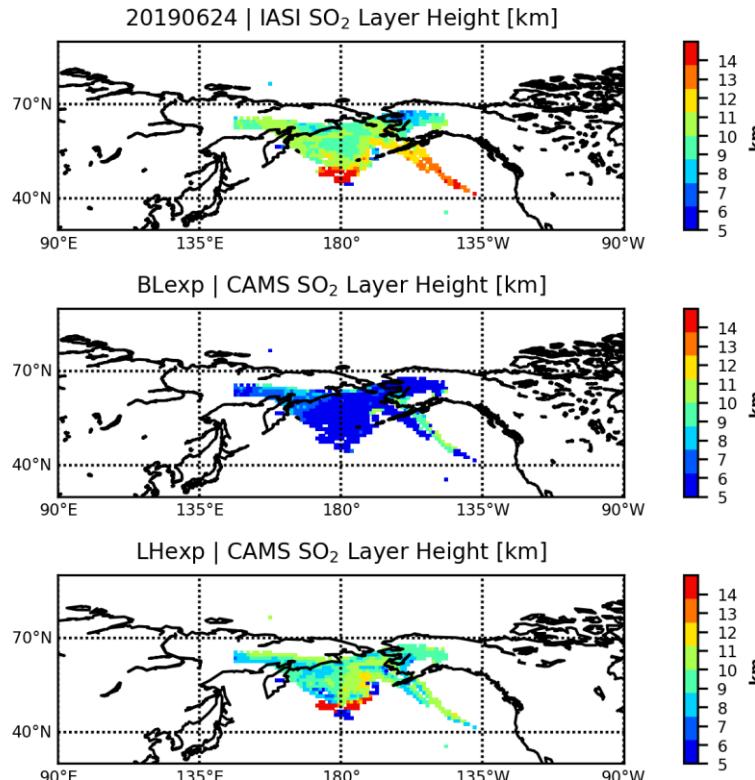
# Raikoke 2019: Validation against IASI SO<sub>2</sub> LH products



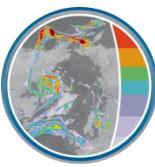
- Mean LH difference between sensors  $\sim \pm 0.5 \pm 3$  km
- Koukouli et al. (2021, submitted to ACP)



# Raikoke 2019: ECMWF/CAMS assimilation



- Active assimilation of SO<sub>2</sub> LH product by CAMS
- Vast improvement of CAMS forecast when S5P SO<sub>2</sub> LH data is used
- CAMS forecast vs IASI:  $-1.5 \pm 2.5$  km (BLexp:  $-5 \pm 2$  km)
- See Inness et al. (2021, GMD, accepted)



# La Soufriere eruption in April 2021

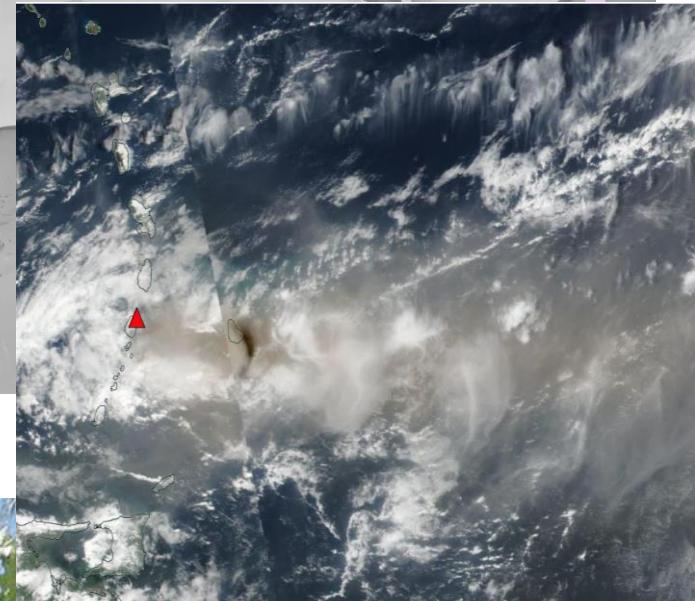
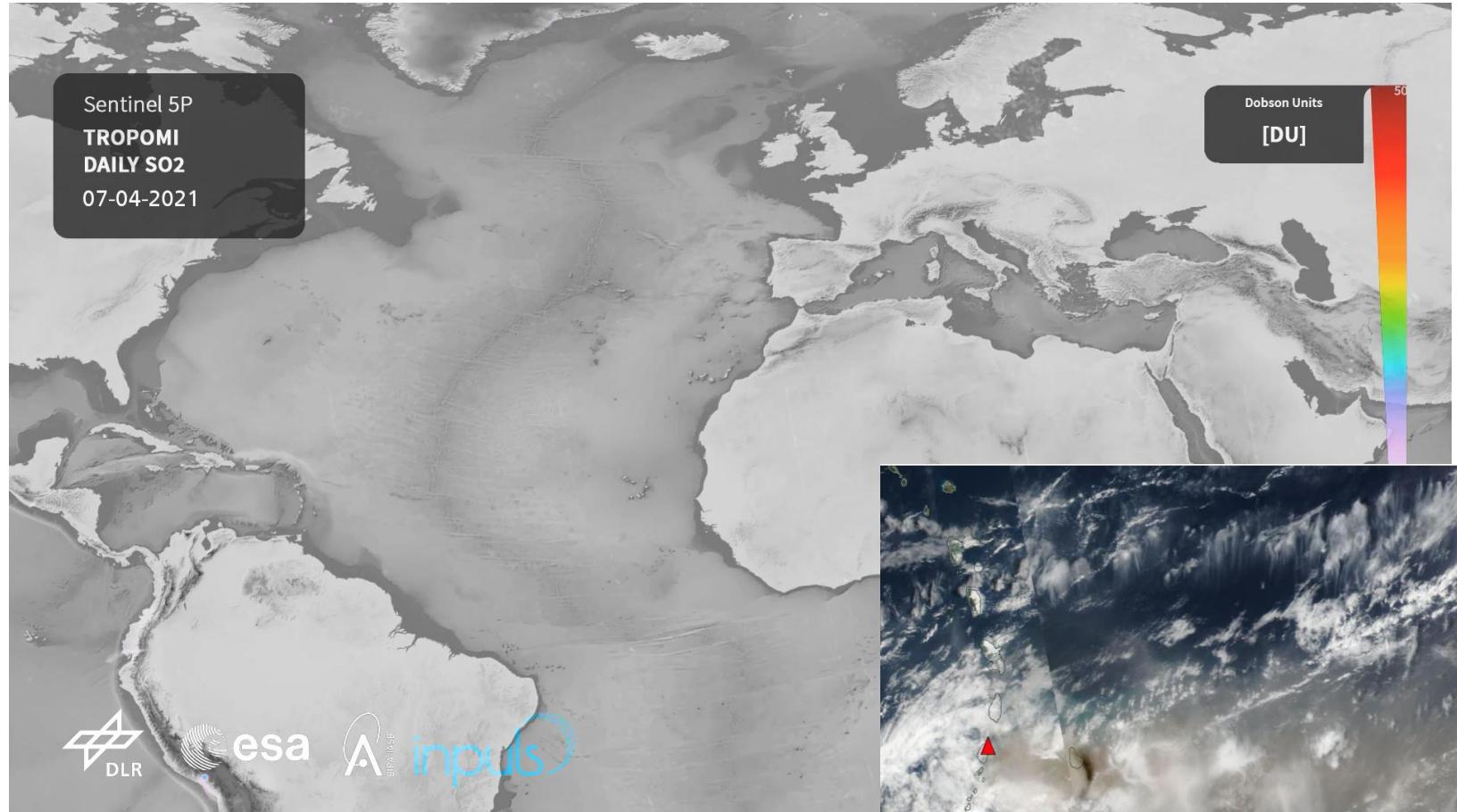
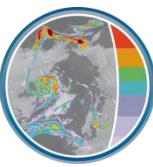
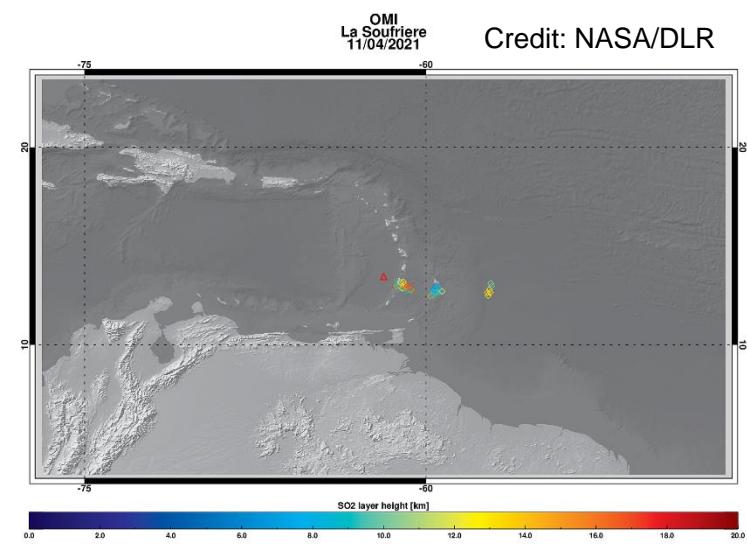
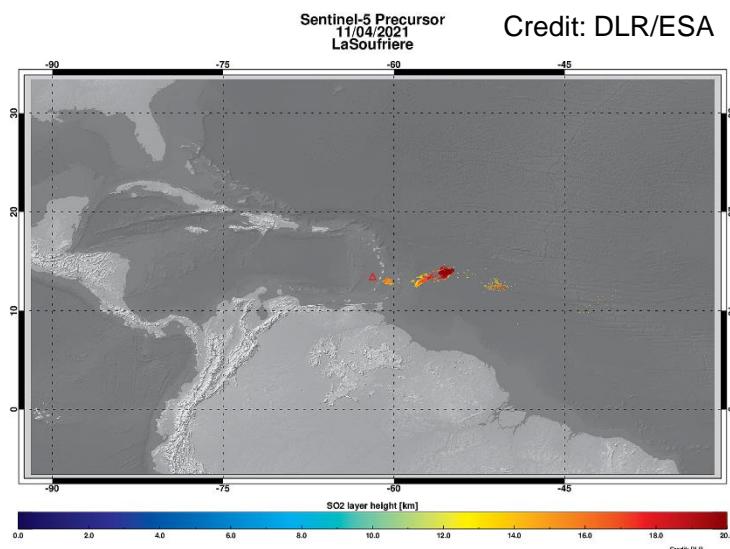
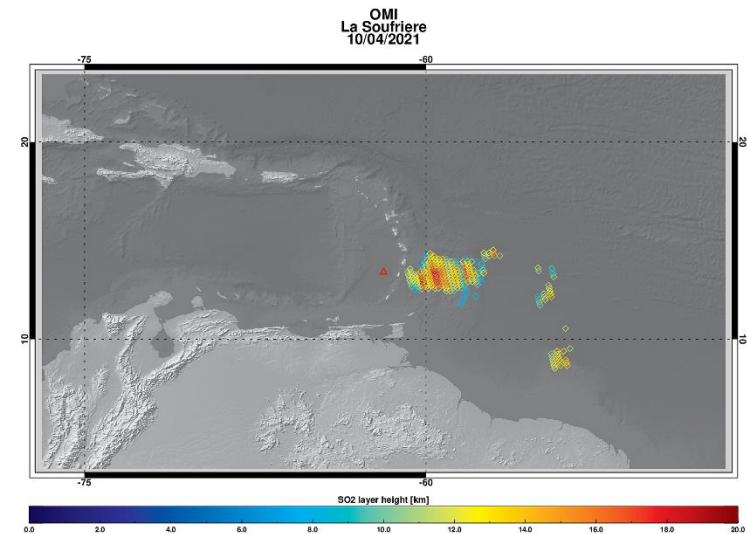
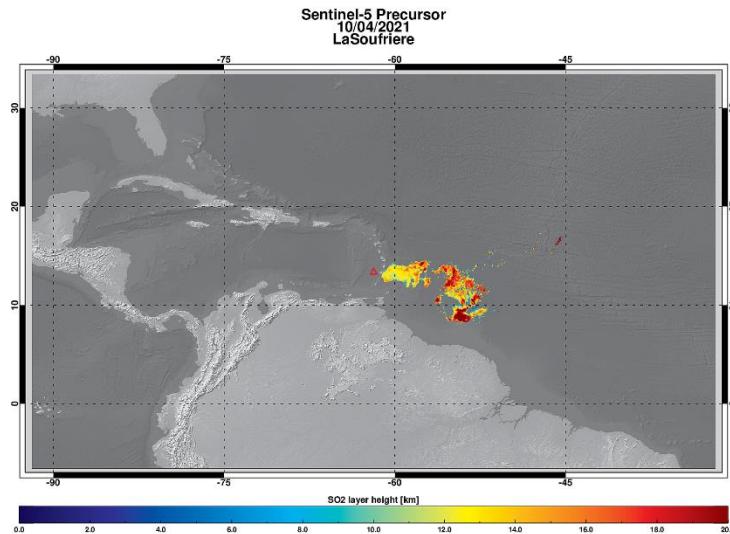


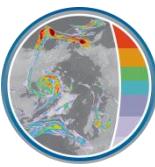
Chart 9



# La Soufriere eruption in April 2021

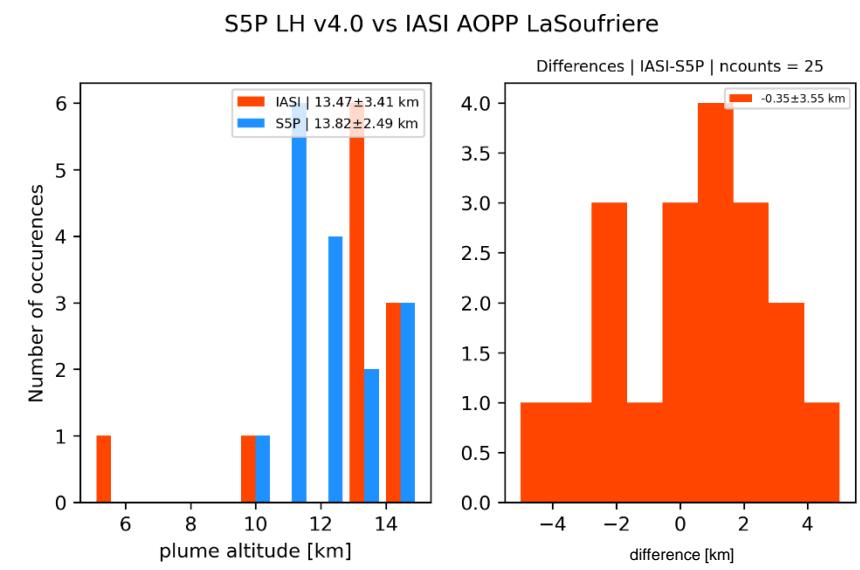
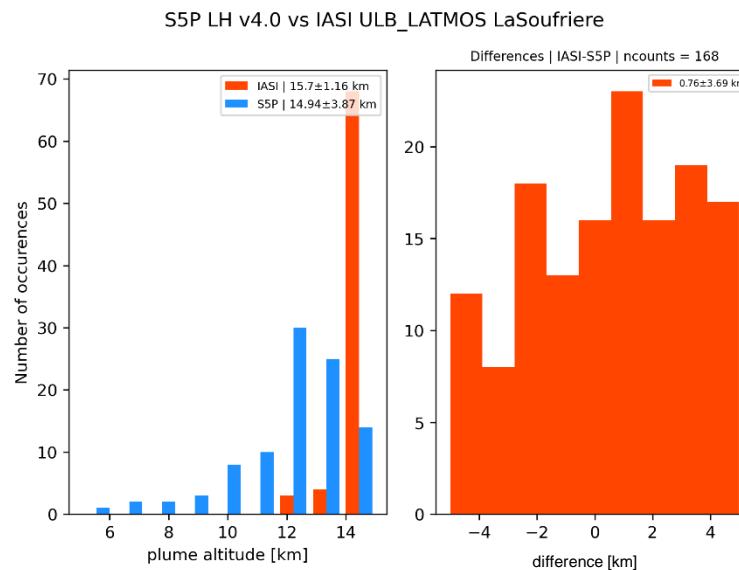
## TROPOMI vs OMI



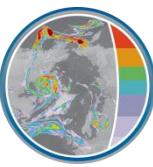


# La Soufrière eruption in April 2021

## Validation against IASI SO<sub>2</sub> LH



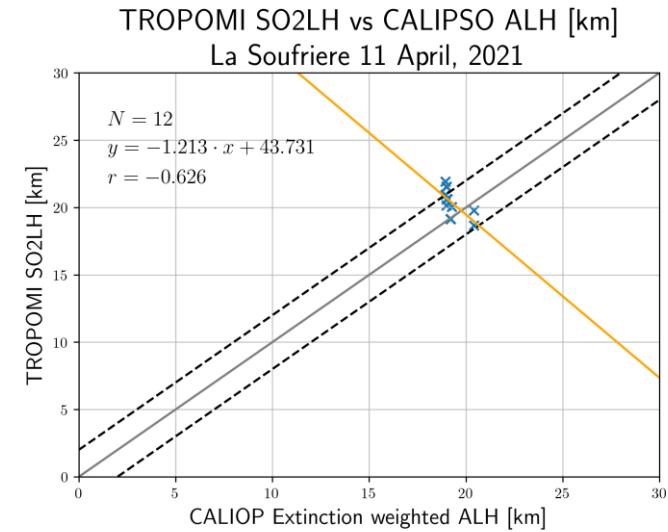
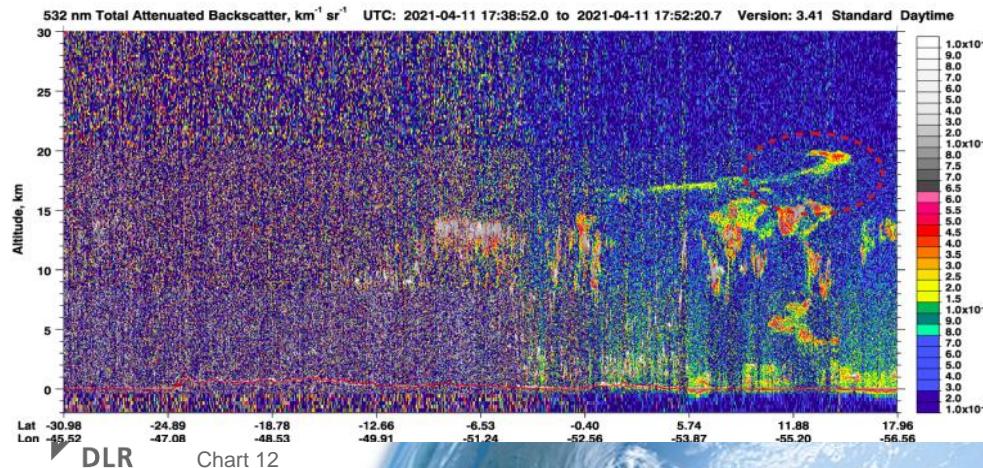
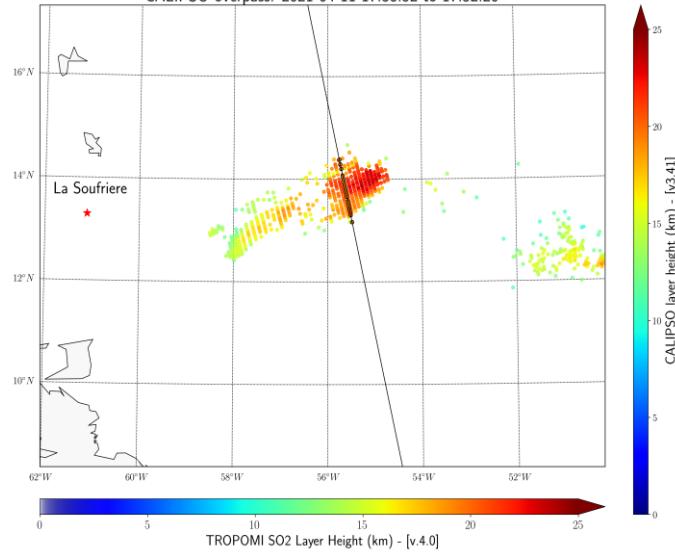
- Mean LH difference between sensors  $\sim \pm 0.6 \pm 3.6$  km
- See Koukouli et al. (2021, submitted to ACP)



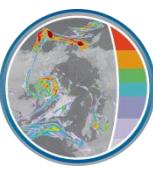
# La Soufrière eruption in April 2021

## Validation against CALIPSO ALH

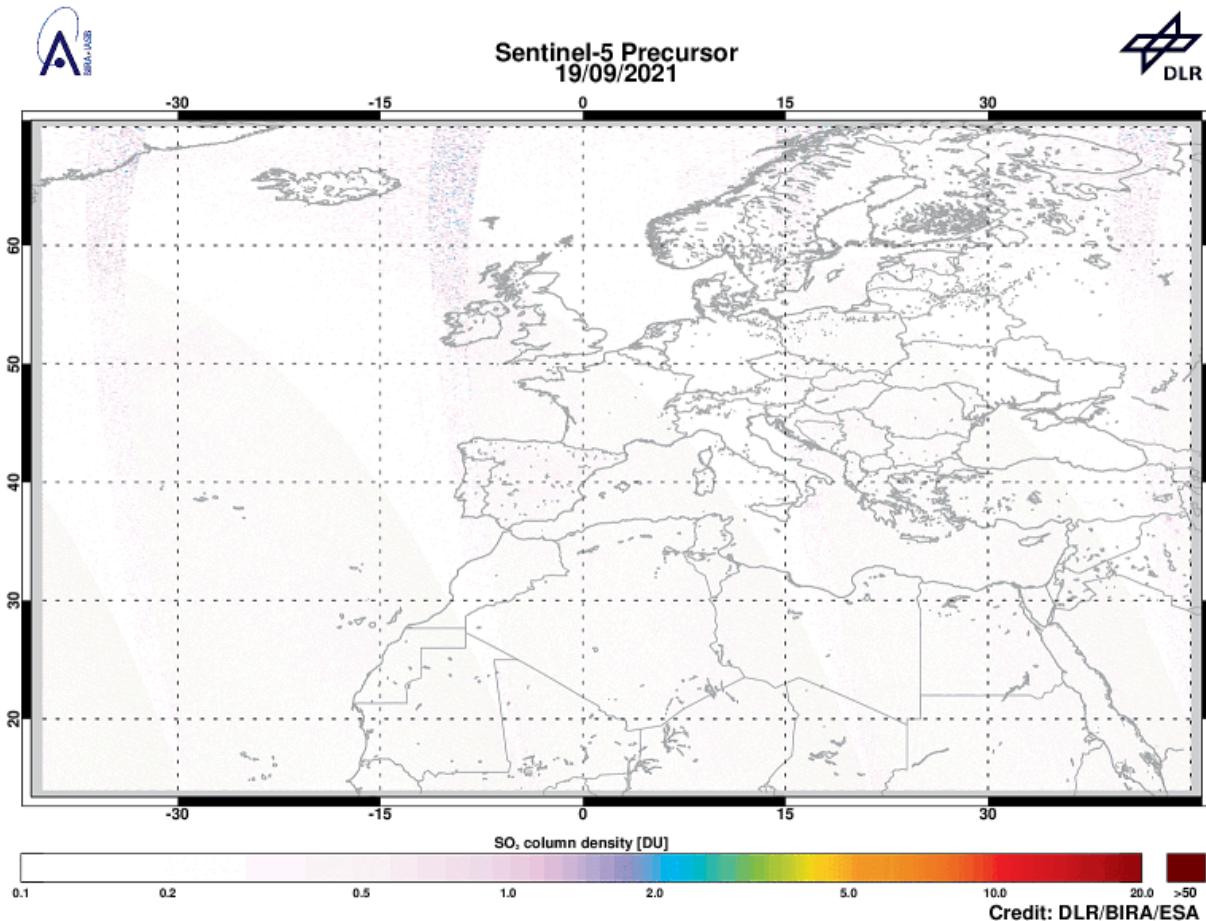
La Soufrière, 11 April 2021 / TROPOMI (Sentinel 5P) - CALIOP (Calipso)  
Sentinel 5P Overpass: 2021-04-11 16:27:06 - 16:29:27UT (Orbit: 18107)  
CALIPSO overpass: 2021-04-11 17:38:52 to 17:52:20



- Height difference within ~1.0km
- See Koukouli et al. (2021, submitted to ACP)



# Cumbre Vieja eruption Sept - ?? 2021

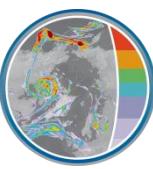


- Volcano erupted on 19 Sept. 2021
- Eruption still ongoing
- Low altitude ash & SO<sub>2</sub>
- SO<sub>2</sub> LH between 2-5km

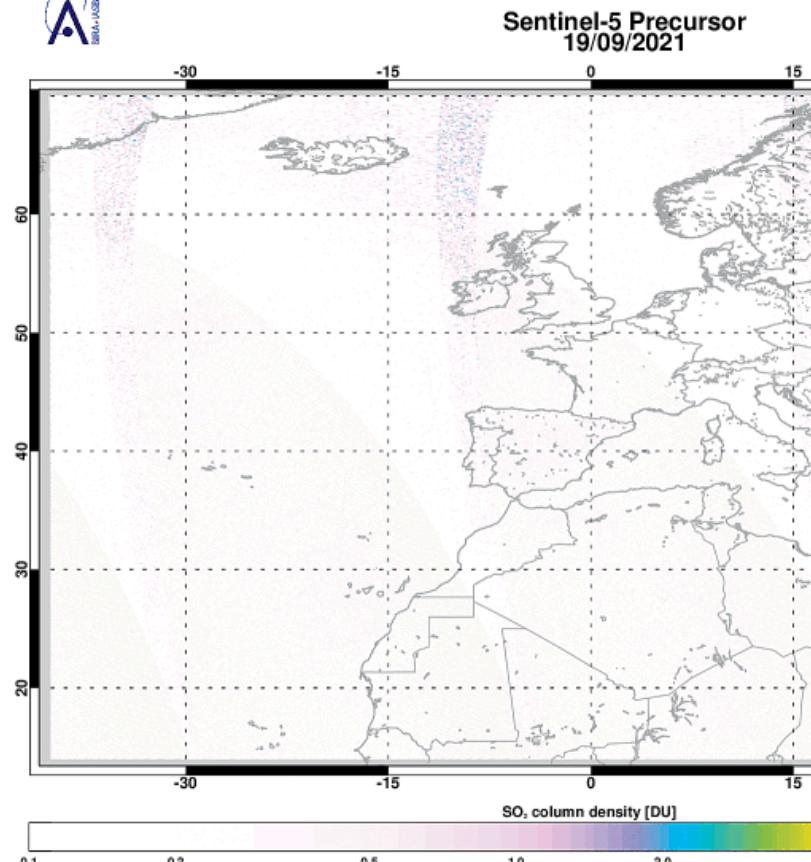


Chart 13





# Cumbre Vieja eruption Sept - ?? 2021



- Volcano erupted on 19 Sept. 2021
- Eruption still ongoing
- Low altitude ash & SO<sub>2</sub>
- SO<sub>2</sub> LH between 2-5km

Sentinel-5 Precursor  
Etna & Cumbre Vieja  
21/09/2021

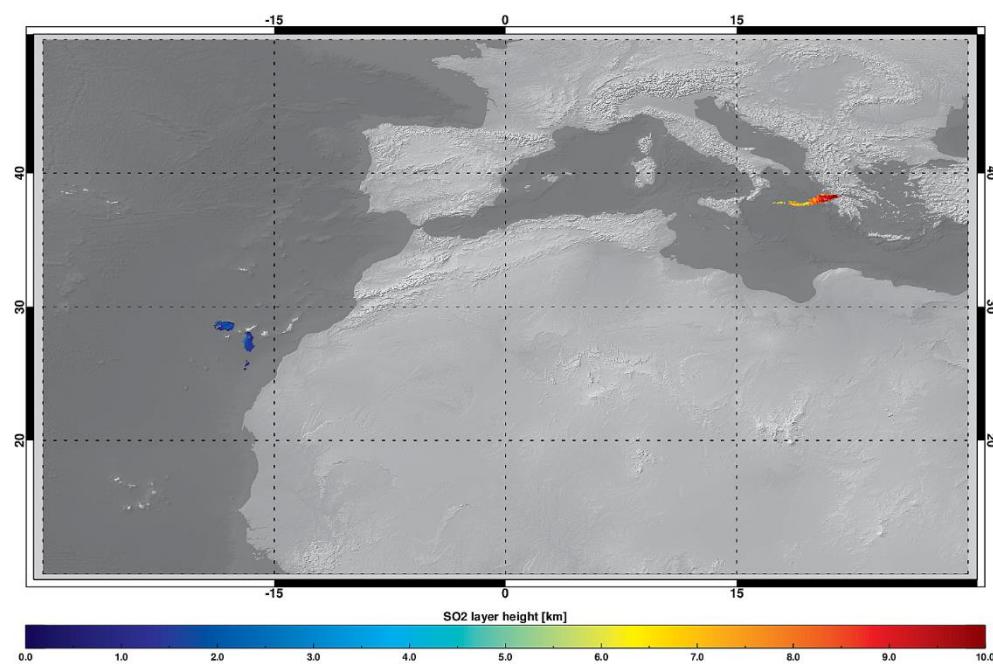
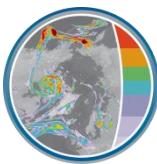


Chart 14

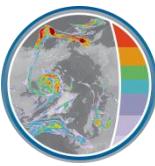




## Conclusion & Outlook

- FP\_ILM SO<sub>2</sub> LH algorithm developed for GOME-2, OMI, S5p
- **Extremely fast and accurate UV SO<sub>2</sub> layer height retrieval**
- S5p SO<sub>2</sub> LH prototype product developed in **S5P+I: SO2LH project**
- S5p SO<sub>2</sub> LH product **successfully validated** against IASI, OMI, CALIPSO
  - Very good agreement for most volcanic cases considered
  - See Koukouli et al. (2021, submitted to ACP)
- S5p SO<sub>2</sub> LH product is actively **assimilated by ECMWF/CAMS**
  - Significant improvement in SO<sub>2</sub> forecast
  - See Inness et al. (2021, accepted in GMT)
- Quasi-NRT SO<sub>2</sub> LH products are generated in **DLR INPULS project**
- Application to Sentinel-4, Sentinel-5, GEMS, etc. is foreseen



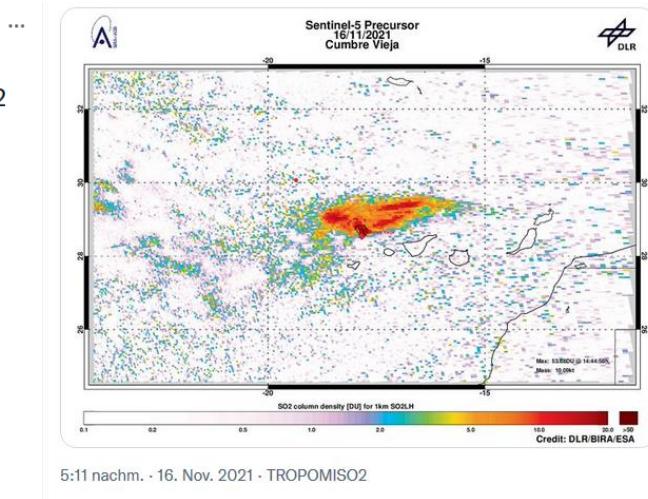


# SO<sub>2</sub> LH: Outreach

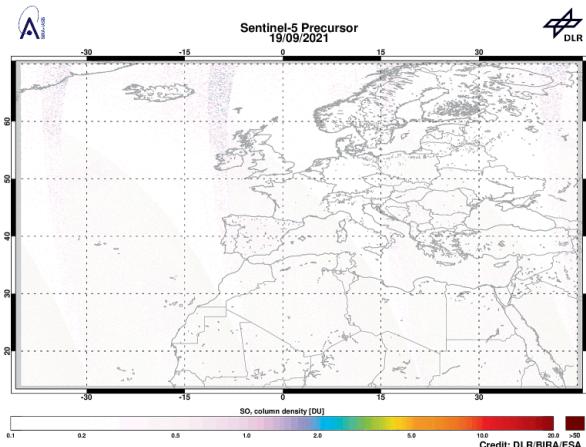
- S5P+I: SO<sub>2</sub> LH project website: <https://atmos.eoc.dlr.de/so2-lh>
- Semi-operational quasi-NRT SO<sub>2</sub> LH retrieval from S5p data once per hour
  - Push-ftp to ECMWF/CAMS for assimilation & forecast
- Immediate Twitter publication @DLrSO2
  - <https://twitter.com/DLrSo2>
  - Name of volcano erupted, SO<sub>2</sub> VCD, SO<sub>2</sub> LH, SO<sub>2</sub> mass



On 2021-11-16 #TROPOMI has detected a strong SO<sub>2</sub> signal at a distance of 7.3km to #CumbreVieja with 48.38DU of SO<sub>2</sub> at an altitude of ~1km. Estimated mass within 300km: 10.1ktons. @tropomi #S5p #Sentinel5p @DLR\_en @BIRA\_IASB @ESA\_EO #SO2LH



5:11 nachm. - 16. Nov. 2021 · TROPOMISO2



TROPOMI SO2 @DLrSo2 · 15. Nov.

Antwort an @DLrSo2

Updated animation of #S5p #tropomi SO<sub>2</sub> measurements of the #CumbreVieja volcanic eruption from 19 Sept - 14 Nov. Note the extended plume from #Etna on 24 Oct!

