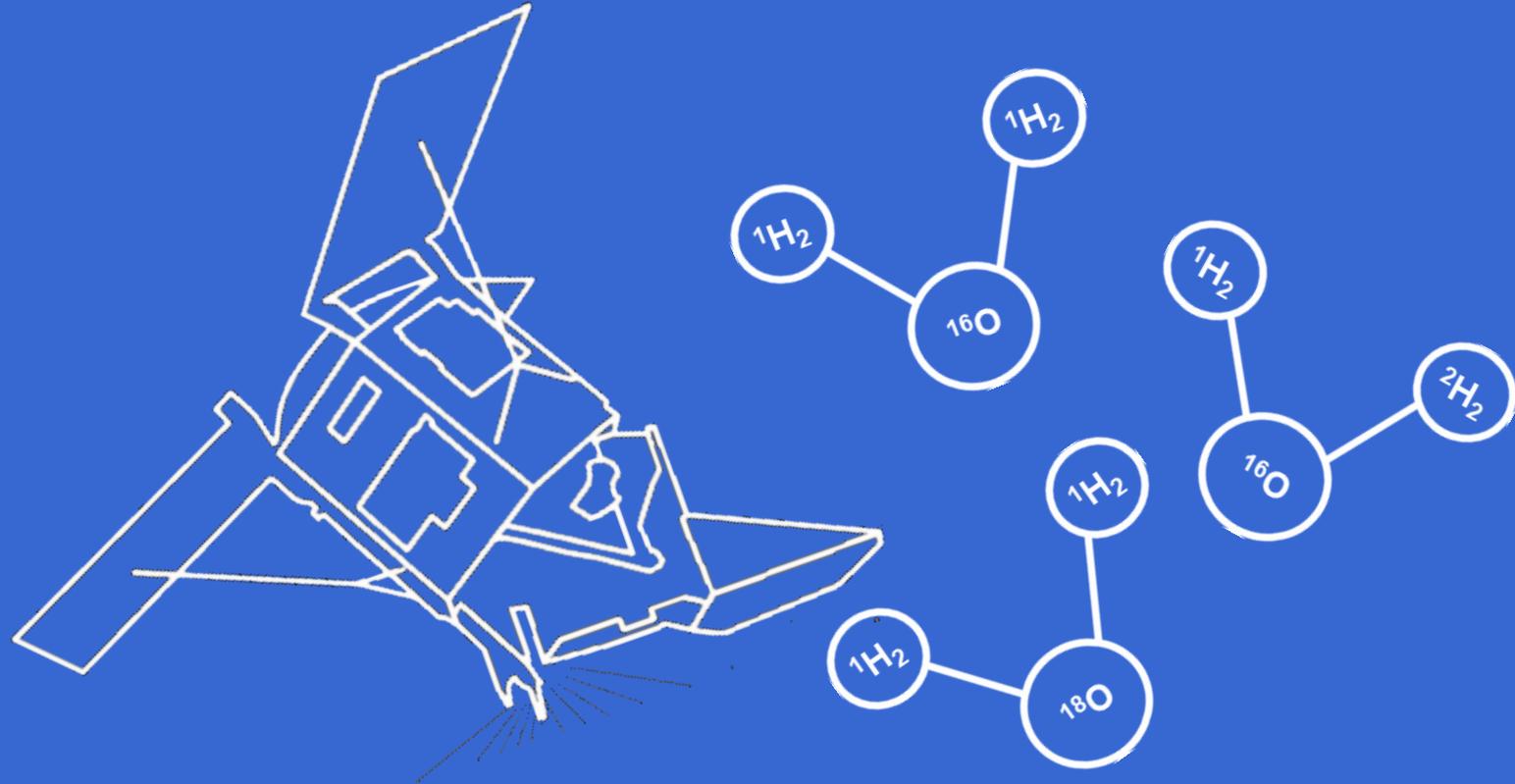


# Observing the global distribution of water vapour isotopologues with the Sentinel-5P mission



Hartmut Boesch, Tim Trent, Matthias Schneider, Farahnaz Khosrawi, Christopher Diekmann, Amelie Röhling, Harald Sodemann, and Iris Thurnherr

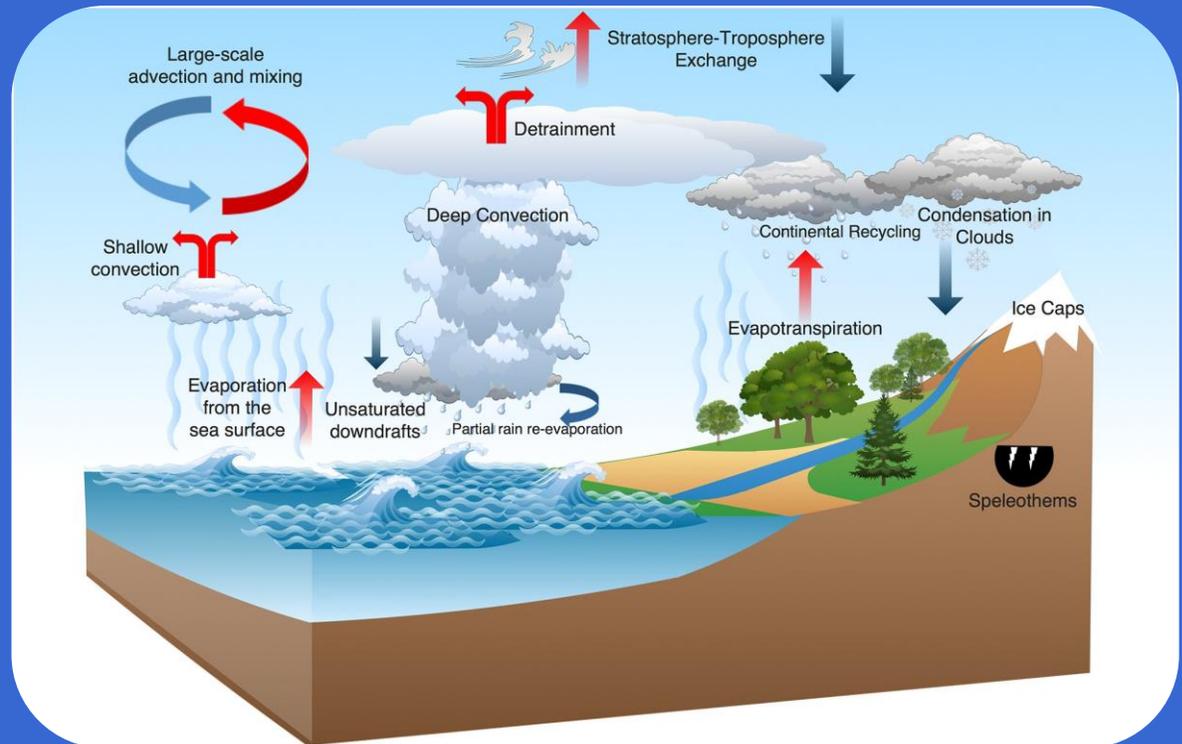
# Outline

- Motivation – why do we care?
- Introduce the product – algorithm & validation
- Scientific case studies
- Outlook

# Motivation

- Atmospheric moisture is key component of Earth system; however, missing knowledge of moisture pathways.
  - What are physical processes responsible for cloud feedbacks and adjustments in models?
  - What are primary factors controlling modes of variability of large-scale atmospheric circulation and precipitation patterns?
  - What is the role of moist processes for major model biases (e.g., diurnal cycle of convection over continents)?
- WCRP grand challenge

## Atmospheric moisture pathways

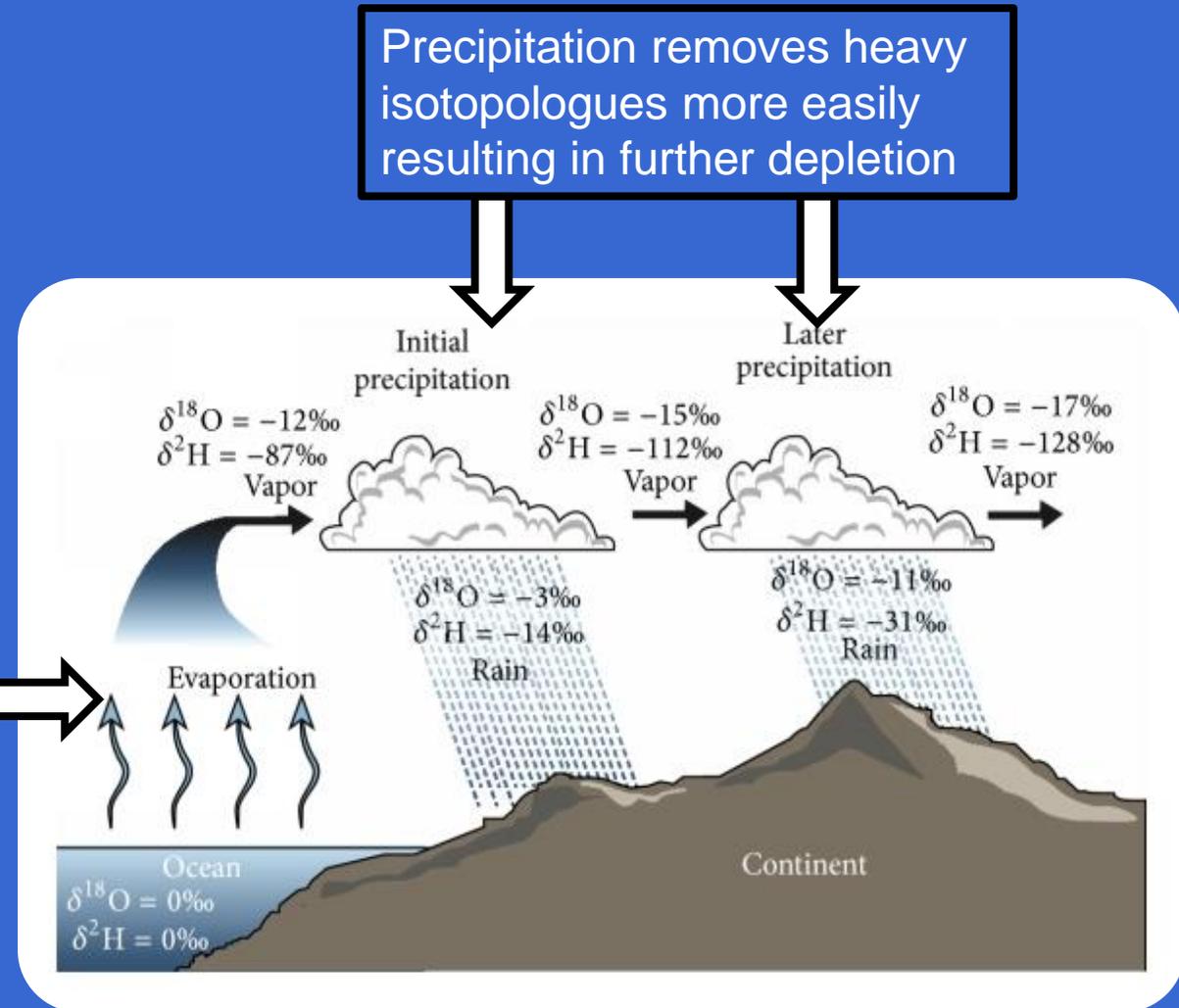


Adopted from Galewski et al. (2016)

# Motivation

- Water isotopologues allow to assess and improve model-based representations of moisture sources and pathways in climate (earth system) models
- Water vapour pairs  $\{\text{H}_2\text{O}, \delta\}$  can provide information on evaporation, condensation, and precipitation.

Depletion of deuterium (D) and O18 during evaporation from ocean surface ( $\text{H}_2\text{O}^{16}$  -> isotopically lighter -> evaporates more readily)

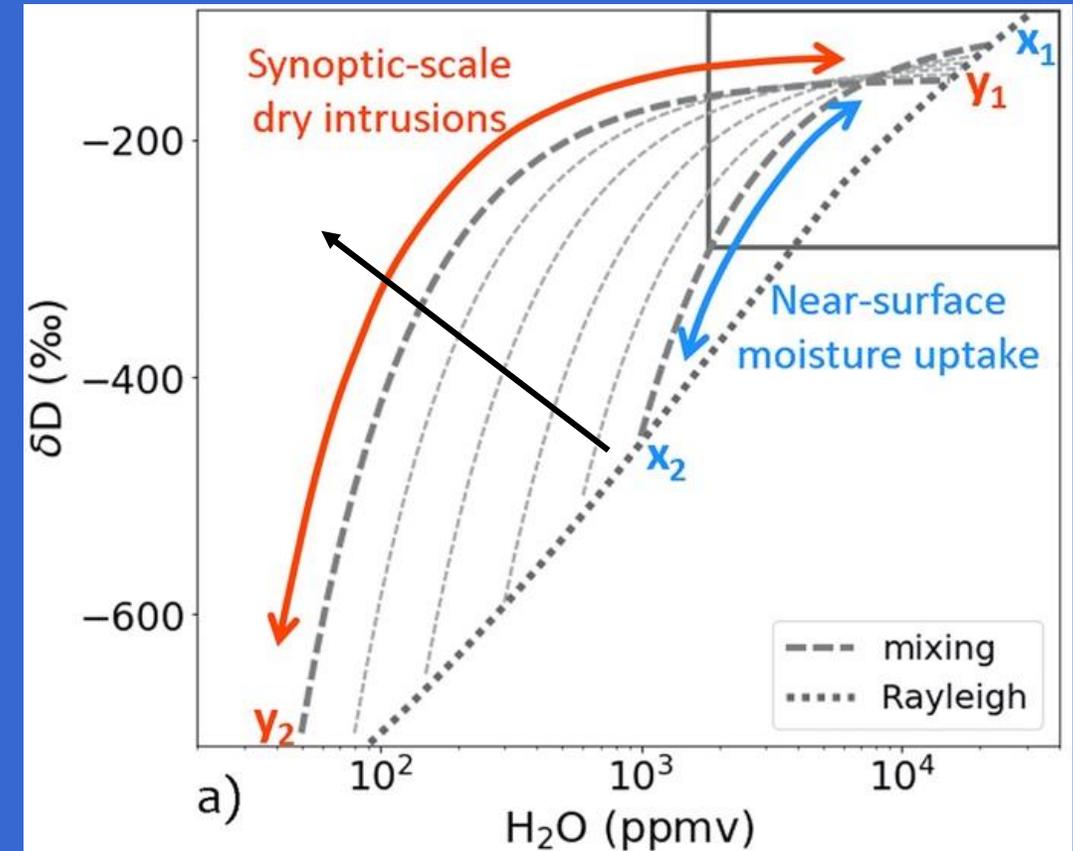


(Figure taken from Xi, X., 2014.)

# Motivation

- Water isotopologues allow to assess and improve model-based representations of moisture sources and pathways in climate (earth system) models
- Water vapour pairs  $\{H_2O, \delta\}$  can provide information on evaporation, condensation, and precipitation.

Mixing (no phase changes) causes distribution above the “Rayleigh line”.

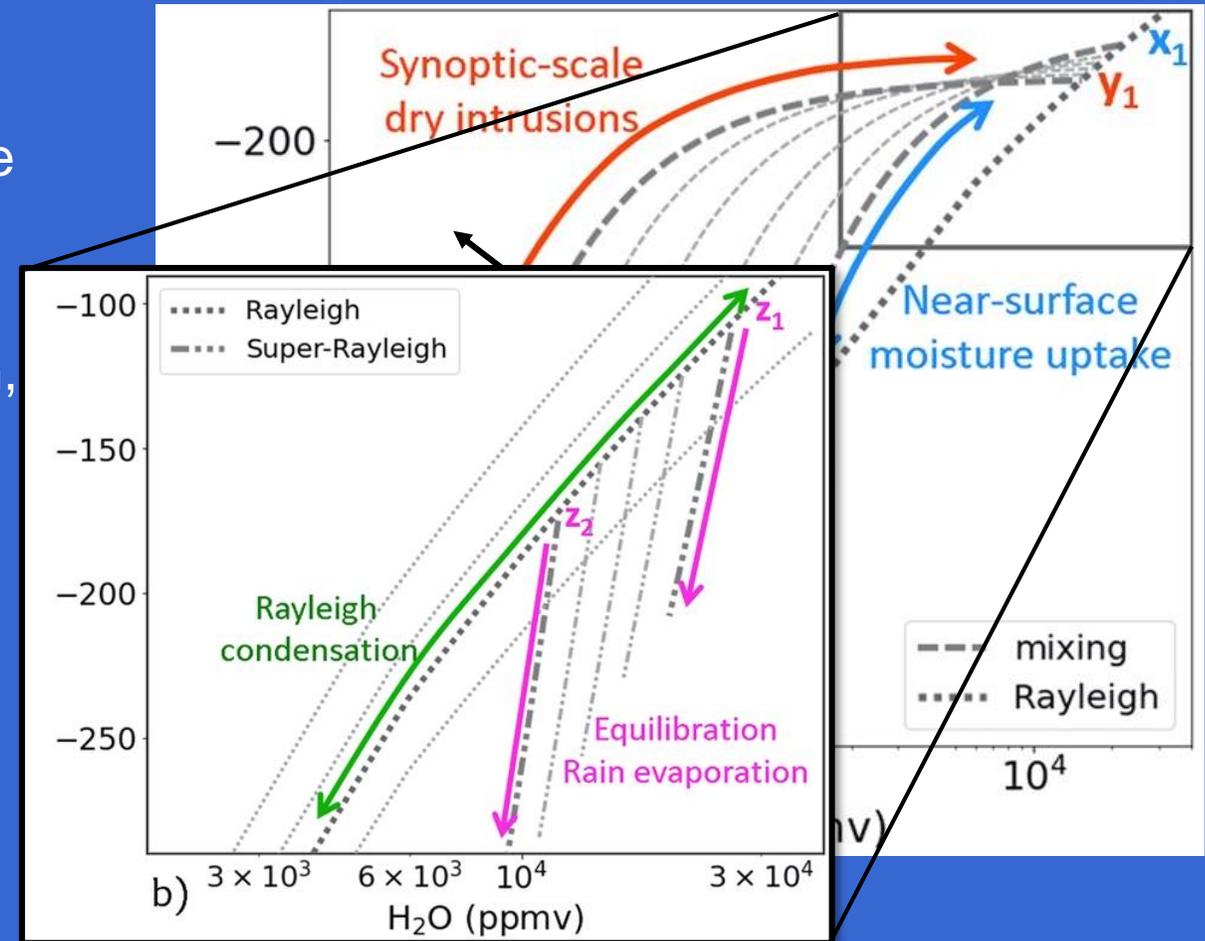


# Motivation

- Water isotopologues allow to assess and improve model-based representations of moisture sources and pathways in climate (earth system) models
- Water vapour pairs  $\{H_2O, \delta\}$  can provide information on evaporation, condensation, and precipitation.

Microphysical processes (convection, clouds) causes distributions below the “Rayleigh line” (“Super-Rayleigh”).

Mixing (no phase changes) causes distribution above the “Rayleigh line”.



# Motivation

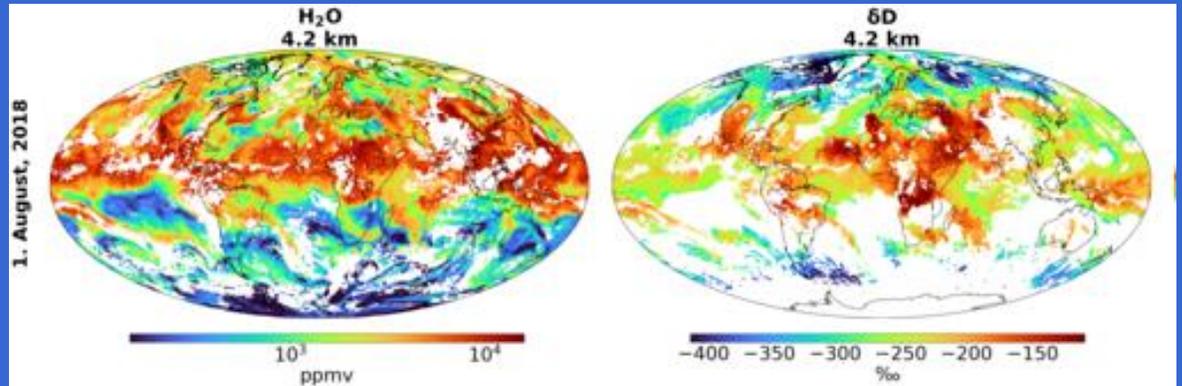
- Satellite observations of stable water Isotopologues can provide global information on the moisture pathways or add an additional constraint.
  - IASI (IR) – mid-tropospheric sensitivity
  - GOSAT and SCIAMACHY (SWIR) – column-averages with boundary layer sensitivity
- Water Isotopologues are given in  $\delta$  (‰) notation:

$$\delta = \left[ \frac{R_{\text{satellite}}}{R_s} - 1 \right] \cdot 1000\text{‰}$$

$$R_s = \begin{cases} \text{HDO} / \text{H}_2\text{O}_{\text{VSMOW}} = 3.11 \times 10^{-4} \\ \text{H}_2\text{O}^{18} / \text{H}_2\text{O}_{\text{VSMOW}} = 2.0052 \times 10^{-3} \end{cases}$$

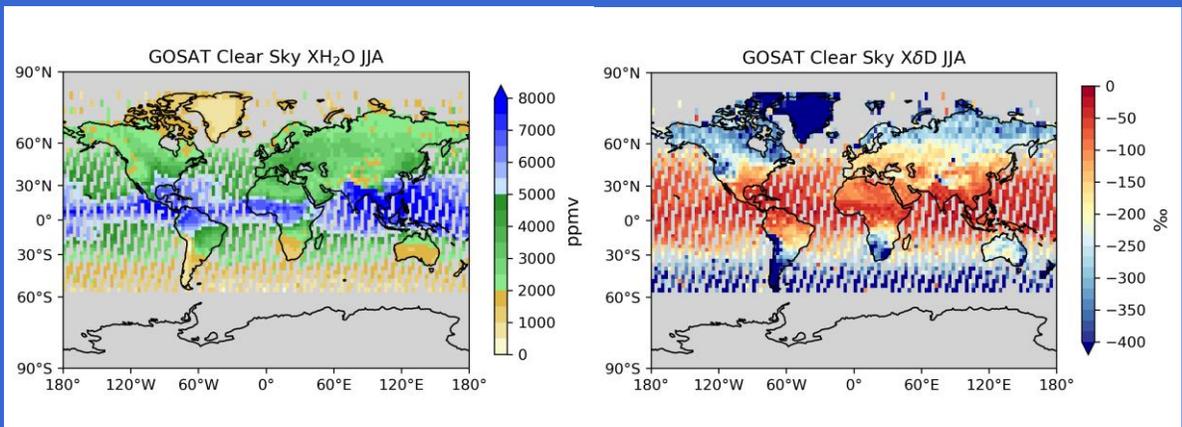
(VSMOW = Vienna Standard Mean Ocean Water)

## IASI daily {H<sub>2</sub>O, δD}



(e.g. Schneider et al. 2016)

## GOSAT seasonal {H<sub>2</sub>O, δD}



(e.g. Boesch et al. 2012 with updates from Trent et al. 2018)

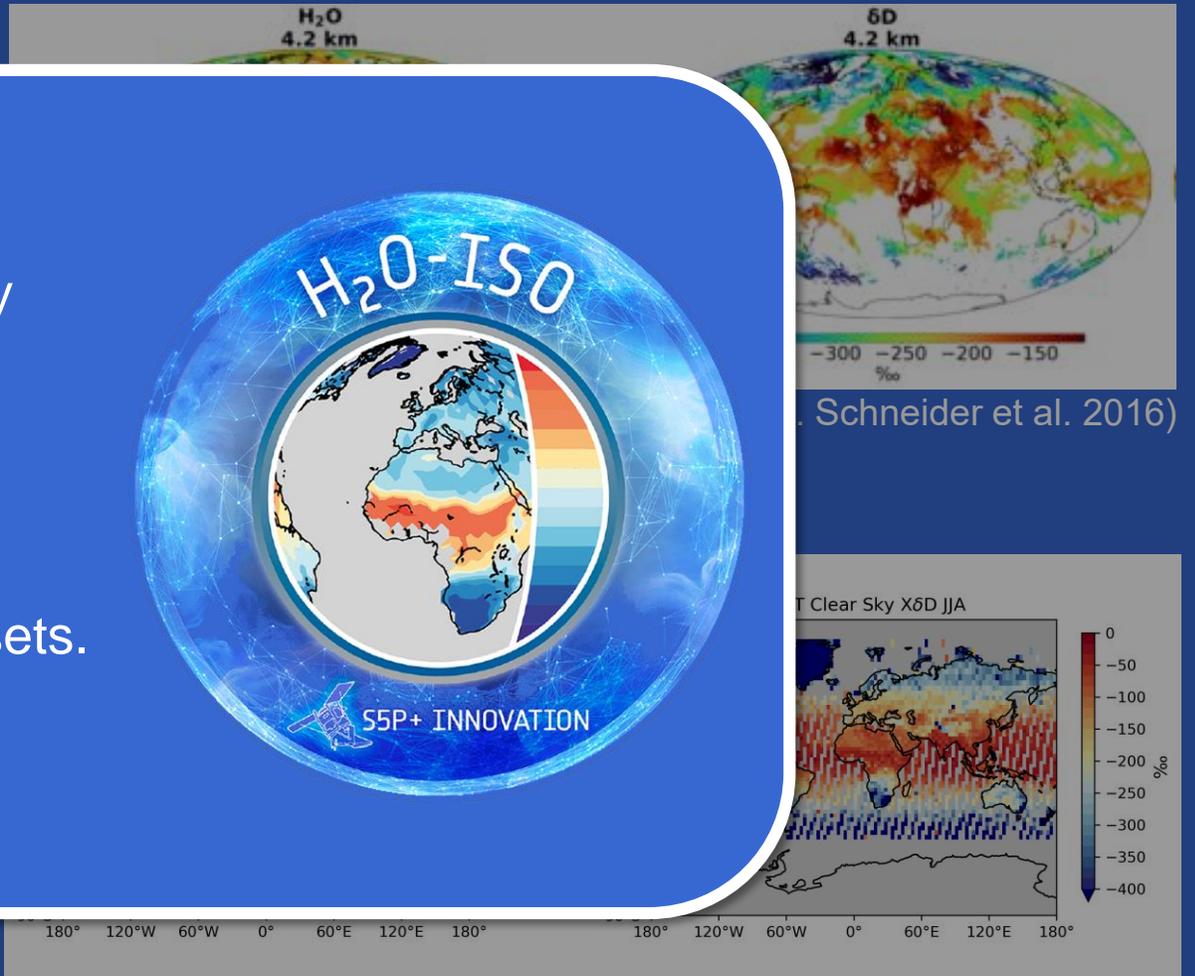
# Motivation

- Satellite observations of water isotopes from space
- Isotopologues provide additional information
  - Improved understanding of the water cycle
  - Improved understanding of climate change
- Water isotopologues are notated as follows
  - To demonstrate the feasibility of measuring stable water isotopologues for S5P, specifically ratios of HDO/H<sub>2</sub>O.
  - Characterisation of retrieval performance through validation studies against TCCON and MUSICA NDAAC reference datasets.
  - Assess the impact of TROPOMI Isotopologues through model intercomparison studies.

$$R_s = \frac{H_2O^{18}}{H_2O_{VSMOW}} = 2.0052 \times 10^{-3}$$

(VSMOW = Vienna Standard Mean Ocean Water)

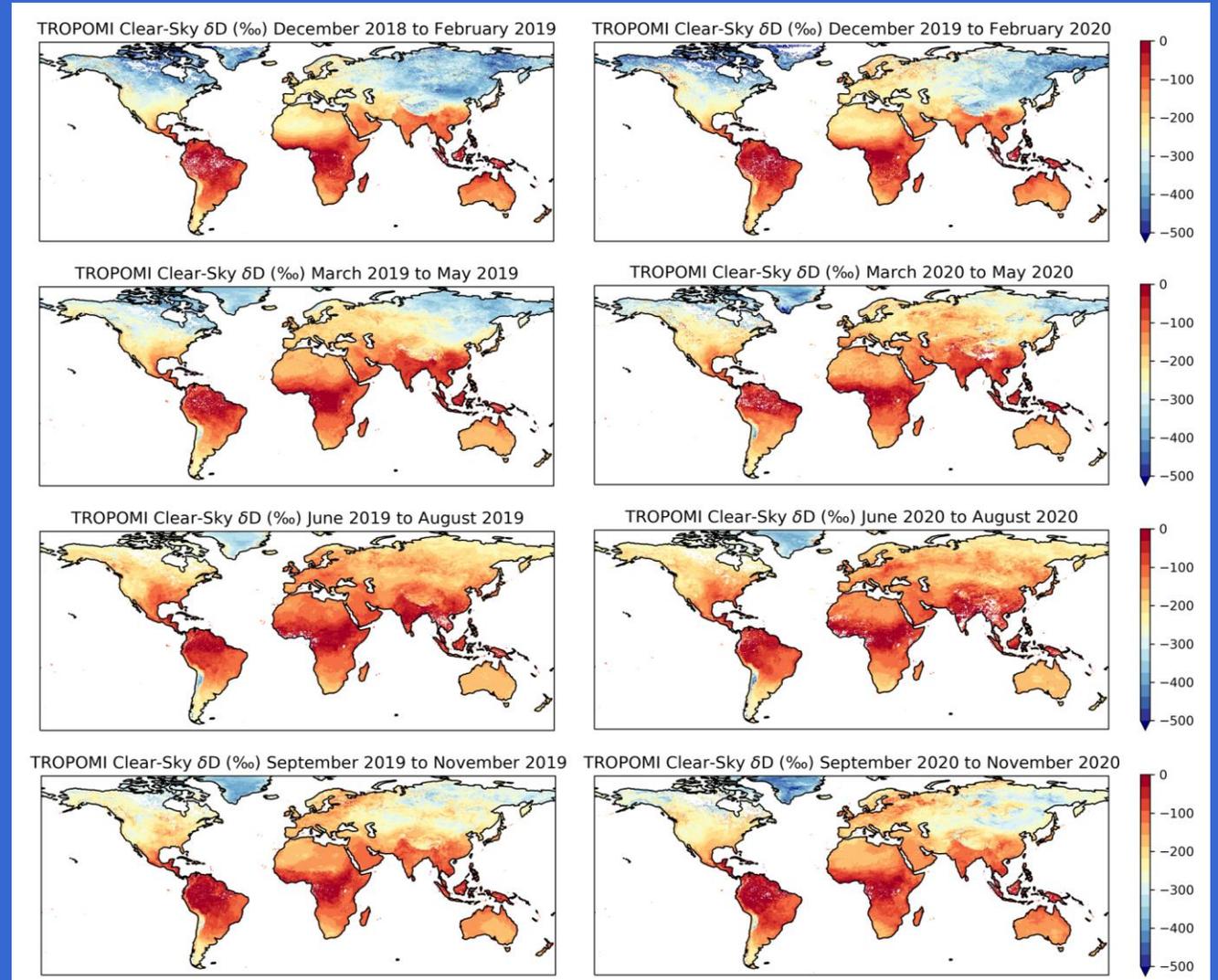
IASI daily {H<sub>2</sub>O, δD}



(e.g. Boesch et al. 2012 with updates from Trent et al. 2018)

# TROPOMI stable water vapour isotopologue product

- Updated version of the UoL-FP algorithm (OE) which has previously used for XCO<sub>2</sub>, XCH<sub>4</sub>, XH<sub>2</sub>O, HDO/H<sub>2</sub>O, and SIF from SWIR platforms (SCIAMACHY, OCO-2, GOSAT, TanSat).
- Major updates include preprocessing, spectroscopy (SEOM-IAS) and solar model (SOLSPEC), qa\_flag development.
- Current version of the L2 product (V1.0.1) currently spans from 1<sup>st</sup> May 2019 to 30<sup>th</sup> April 2021 and contains XH<sub>2</sub>O, XHDO and XδD.



# TROPOMI stable water vapour isotopologue product

- Update algorithm used for HDO/ H<sub>2</sub>O platform GOSAT
- Major preprint (SEO) (SOL)
- Current (V1.0)

TROPOMI Clear-Sky δD (‰) December 2018 to February 2019      TROPOMI Clear-Sky δD (‰) December 2019 to February 2020

**Summary**

Atmospheric moisture is a key factor for the redistribution of heat in the atmosphere and there is strong coupling between atmospheric circulation and moisture pathways which is responsible for most climate feedback mechanisms. Water isotopologues can make a unique contribution for better understanding this coupling. In recent years, water vapour isotopologue observations from satellites have become available from thermal nadir infrared measurements (TES, AIRS, IASI) which are sensitive above the boundary layer and from shortwave-infrared (SWIR) sensors (GOSAT, SCIAMACHY) that provide column averaged concentrations including sensitivity

**Documents:**

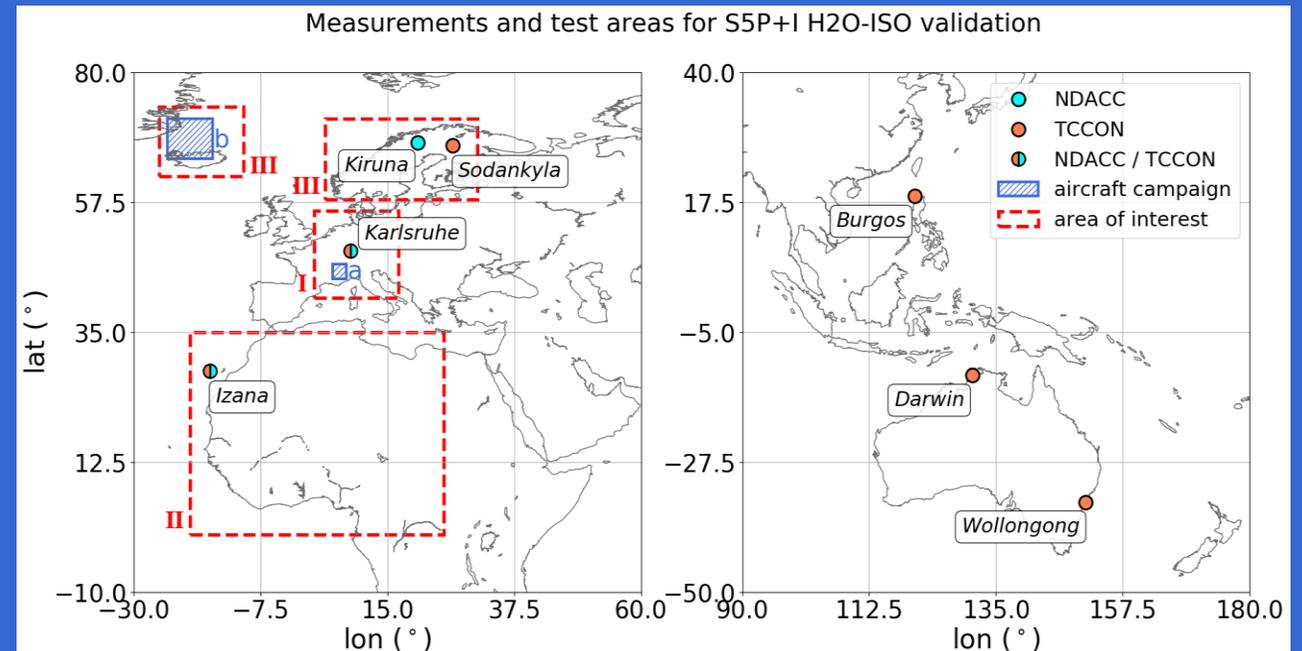
- Requirements Baseline Document (RB)
- Auxiliary User Manual (AUM)
- Algorithm Theoretical Basis Document (ATBD)
- Product User Manual (PUM)

**Logos:** esa, UNIVERSITY OF LEICESTER, KIT, UNIVERSITY OF BERGEN

Details on algorithm and data used detailed in project documentation available from project website.

# Validation and Study Regions

- Ground-based FTIR monitoring sites and areas identified for development and impact studies.
- TROPOMI data over validation sites May 2018 – August 2020 was generated.
- MUSICA NDACC and TCCON remote sensing stations as fiducial references.
- Colocation criteria was investigated and set to TROPOMI pixels within a 50 km radius and  $\pm 3$  hours of a NDAAC/TCCON measurement were used.



**Table 3:** Ground-based station, FTIR data availability, Code used for retrieving the FIR data and responsible team.

FTIR Station	Ground-based data availability	Code	Team
Karlsruhe	Apr 2010 – Apr 2021	PROFFIT	KIT-ASF
Kiruna	Mar 1996 – Apr 2021	PROFFIT	KIT-ASF; IRF Kiruna
Sodankylä	May 2009 - Oct 2020	GFIT	FMI
Burgos	Mar 2017 - Mar 2020	GFIT	NIES Tsukuba; U. of Wollongong
Karlsruhe	Apr 2010 – Oct 2020	GFIT	KIT-ASF
Darwin	Aug 2005 – Mar 2020	GFIT	U. of Wollongong
Wollongong	Jun 2008 – Mar 2020	GFIT	U. of Wollongong

# Initial Validation Results

FTIR Station	# of colocated qa-filtered pixel (days) for 50 km	Mean bias [‰]	Uncertainty of mean bias [‰]	StdD of difference [‰]
Karlsruhe	46,950 (164)	-20.6 (-16.7)	0.2 (1.9)	31.9 (24.2)
Kiruna	14,567 (88)	-6.9 (6.6)	0.3 (3.0)	37.8 (27.7)
<b>NDACC</b>	<b>61,517 (252)</b>	<b>-17.3 (-8.6)</b>	<b>0.1 (1.8)</b>	<b>33.9 (27.8)</b>
Sodankylä	61,265 (241)	-10.2 (12.2)	0.2 (2.5)	39.6 (38.6)
Burgos	2,269 (85)	-52.7 (-41.1)	0.5 (3.2)	25.4 (29.8)
Karlsruhe	41,856 (170)	-26.5 (-21.9)	0.2 (2.3)	33.8 (29.4)
Darwin	22,437 (134)	-48.7 (-54.0)	0.1 (1.6)	18.3 (18.9)
Wollongong	15,987 (224)	-19.7 (-13.4)	0.3 (2.1)	36.8 (31.5)
<b>TCCON</b>	<b>143,814 (854)</b>	<b>-21.0 (-14.8)</b>	<b>0.1 (1.2)</b>	<b>36.5 (36.0)</b>
<b>ALL SITES</b>	<b>205,331 (1,106)</b>	<b>-21.1 (-15.1)</b>	<b>0.1 (1.1)</b>	<b>36.5 (36.8)</b>

# Initial Validation Results

- The highest standard deviation values are found for the polar sites Kiruna and Sodankylä for solar zenith angles above 55°.
- Increased scatter for albedo values below about 0.07, especially at the high latitude sites Sodankylä and Kiruna.
- Strong dependency of the data quality with the total atmospheric water vapour content (1500 ppmv).
- Bias correction based XH<sub>2</sub>O dependence:  
-(-0.0112‰\*XH<sub>2</sub>O + 1.03‰).

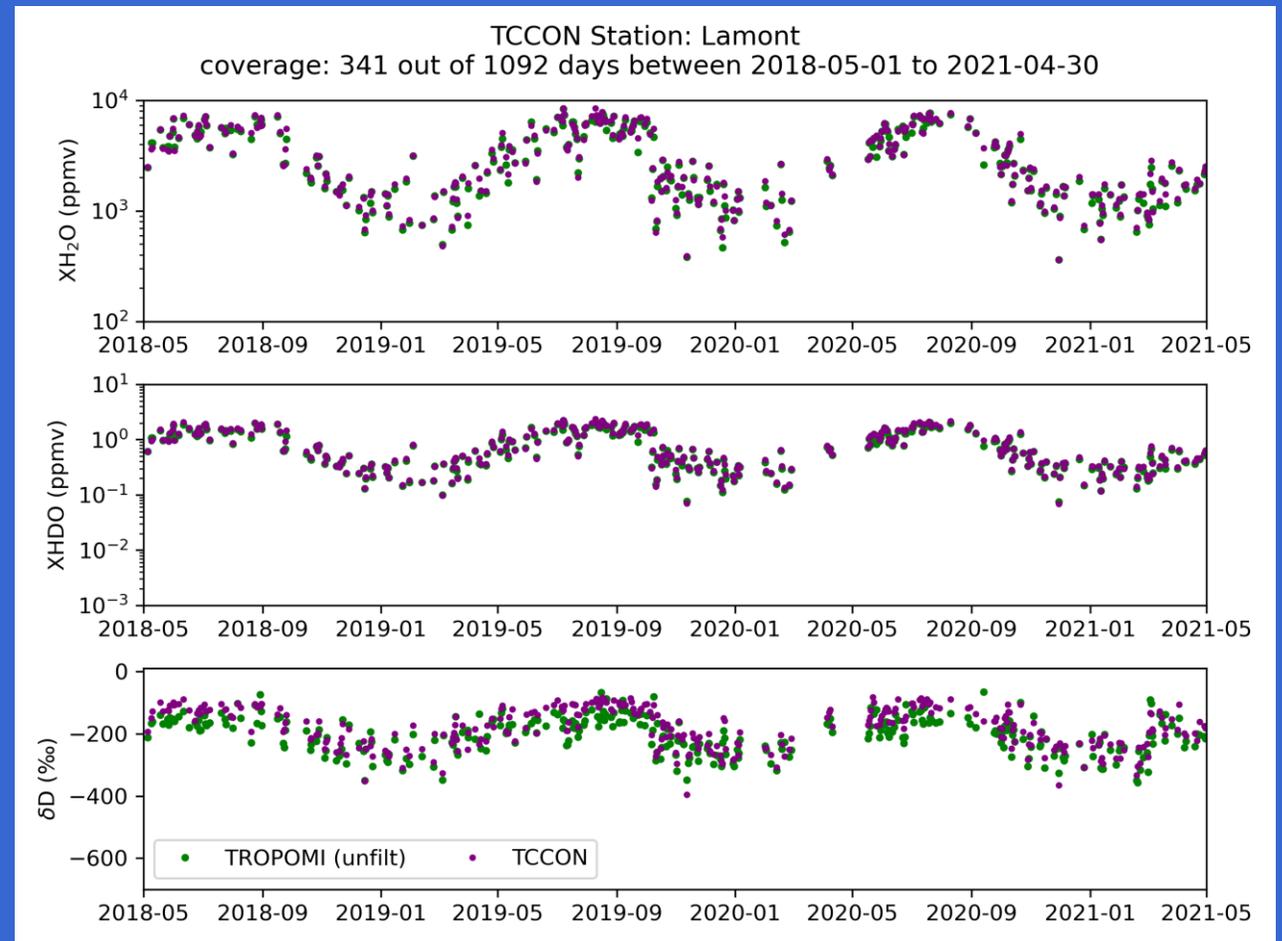
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ALL SITES	205,331 (1,106)	-21.1 (-15.1)	0.1 (1.1)	36.5 (36.8)

# Bias Corrected Results

FTIR Station	# of colocated qa-filtered pixel (days) for 50 km	Mean bias [‰]	Uncertainty of mean bias [‰]	StdD of difference [‰]
Karlsruhe	46,950 (164)	-0.9 (8.5)	0.0 (0.7)	32.5 (23.2)
Kiruna	14,567 (88)	13.0 (24.6)	0.1 (2.6)	37.5 (28.1)
<b>NDACC</b>	<b>61,517 (252)</b>	<b>2.4 (14.1)</b>	<b>0.0 (0.9)</b>	<b>34.3 (26.1)</b>
Sodankylä	61,265 (241)	13.4 (32.7)	0.1 (2.1)	38.4 (35.6)
Burgos	2,269 (85)	-7.2 (7.6)	0.2 (0.8)	26.3 (28.9)
Karlsruhe	41,856 (170)	-6.4 (3.8)	0.0 (0.3)	33.3 (25.2)
Darwin	22,437 (134)	-14.3 (-10.5)	0.1 (0.9)	18.6 (19.1)
Wollongong	15,987 (224)	2.8 (11.6)	0.2 (0.8)	35.4 (29.8)
<b>TCCON</b>	<b>143,814 (854)</b>	<b>2.0 (12.4)</b>	<b>0.0 (1.2)</b>	<b>35.3 (31.0)</b>
<b>ALL SITES</b>	<b>205,331 (1,106)</b>	<b>1.9 (12.6)</b>	<b>0.0 (0.2)</b>	<b>35.2 (31.3)</b>

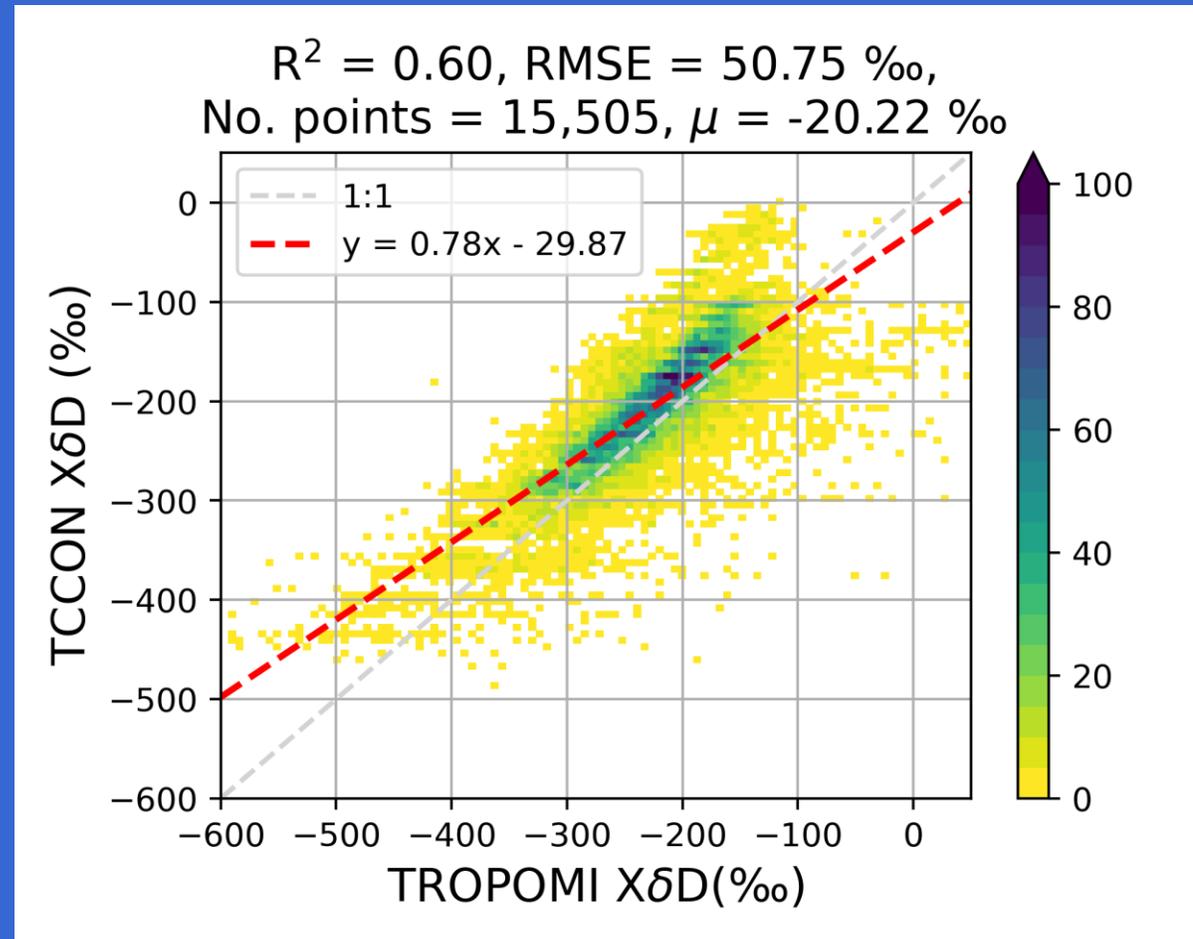
# Enhanced Validation and bias correction

- Uses full 3 year data set and collocations from 20 TCCON sites.
- Tighter collocation criteria, +/-30 mins, within 50 km,  $p_{\text{surf}}$  within 5 hPa and T700 within 2 K
- Calculate daily means.
- Utilize dependence on SZA, albedo, XH<sub>2</sub>O + others(?)
- Bias correction uses ML approach model build on extra-trees regressor



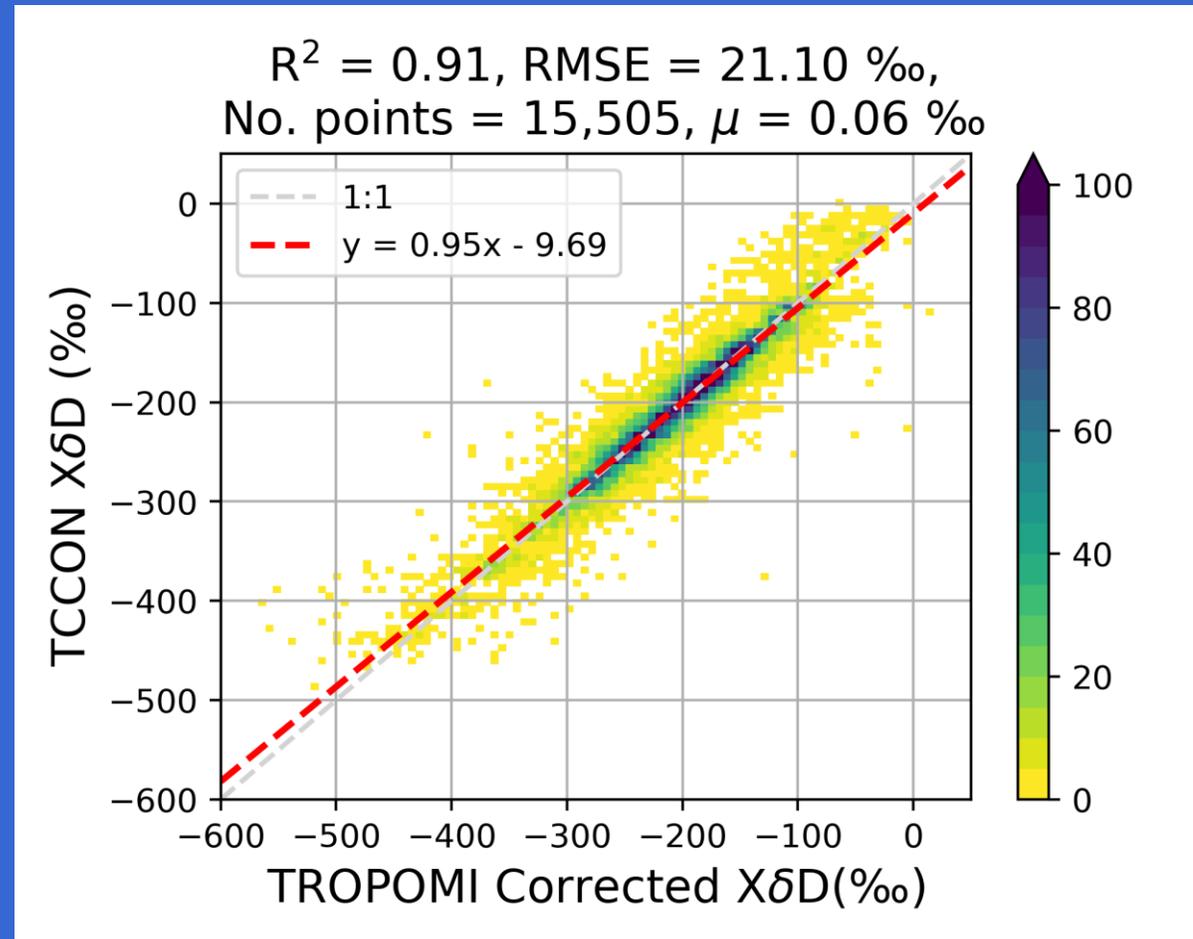
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# Enhanced Validation and bias correction

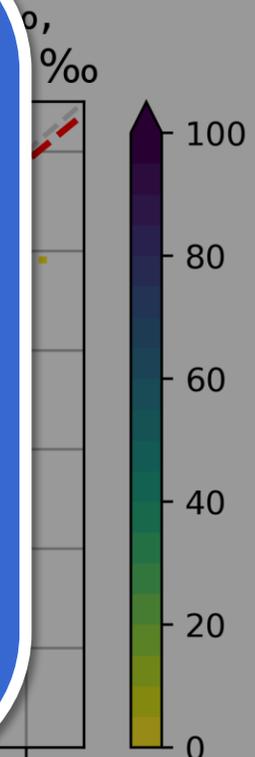
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# Enhanced Validation and bias correction

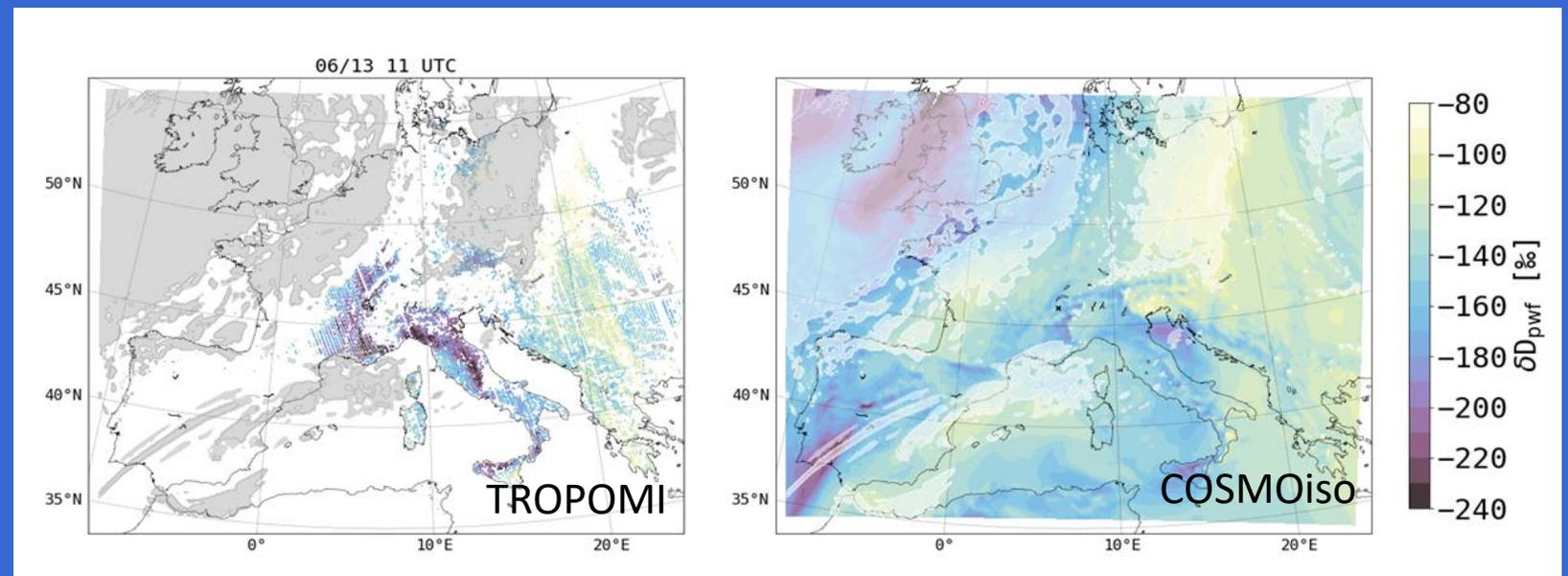
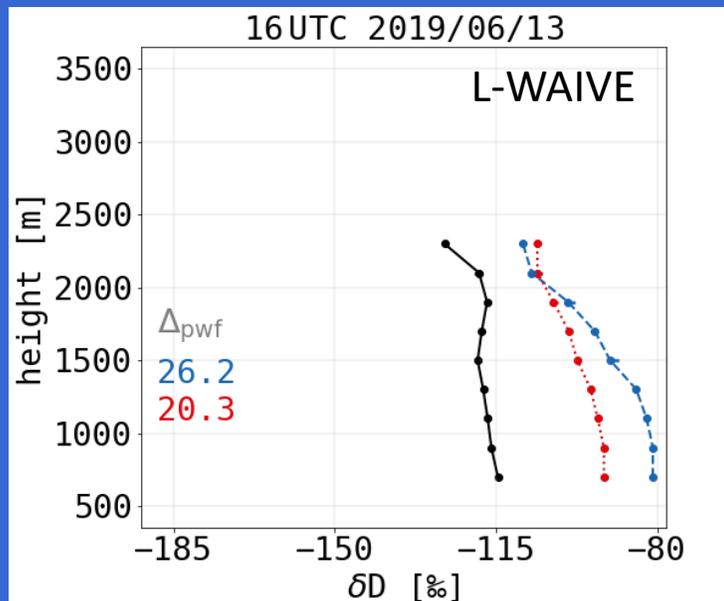
- Uses collocated
  - Tighter mins, and T
  - Calculated
  - Utilized XH<sub>2</sub>O
  - Bias correction model
- Initial results look promising; however, bias correction could just perform well over TCCON sites.
  - Can test over MUSICA NDAAC sites
  - New COCCON measurements over new sites outside of current TCCON network.

TROPOMI Corrected  $X\delta D$  (‰)



# Scientific case study 1: Scale analysis

- Datasets of different spatial and temporal resolution:
  - In situ measurements during the LWAIVE campaign in Annecy 2019 (Chazette et al. 2021)
  - Sentinel 5-P retrieval of total column  $\delta D$
  - COSMOiso (Pfahl et al. 2012) simulations during the L-WAIVE campaign



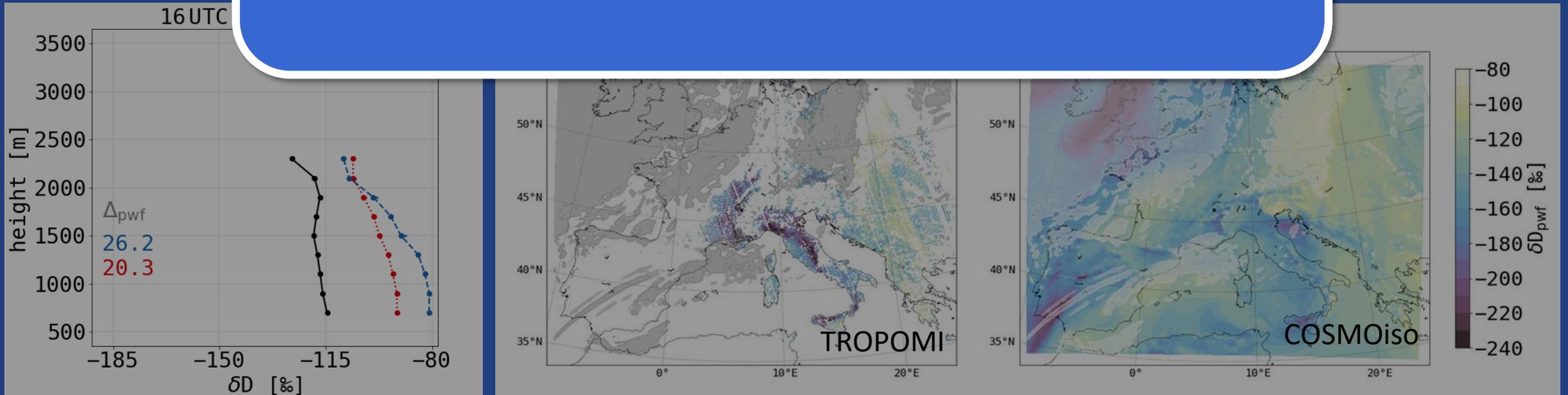
# Scientific case study 1: Scale analysis

- Datasets

- In situ
- Sentinel-2
- COSMOiso

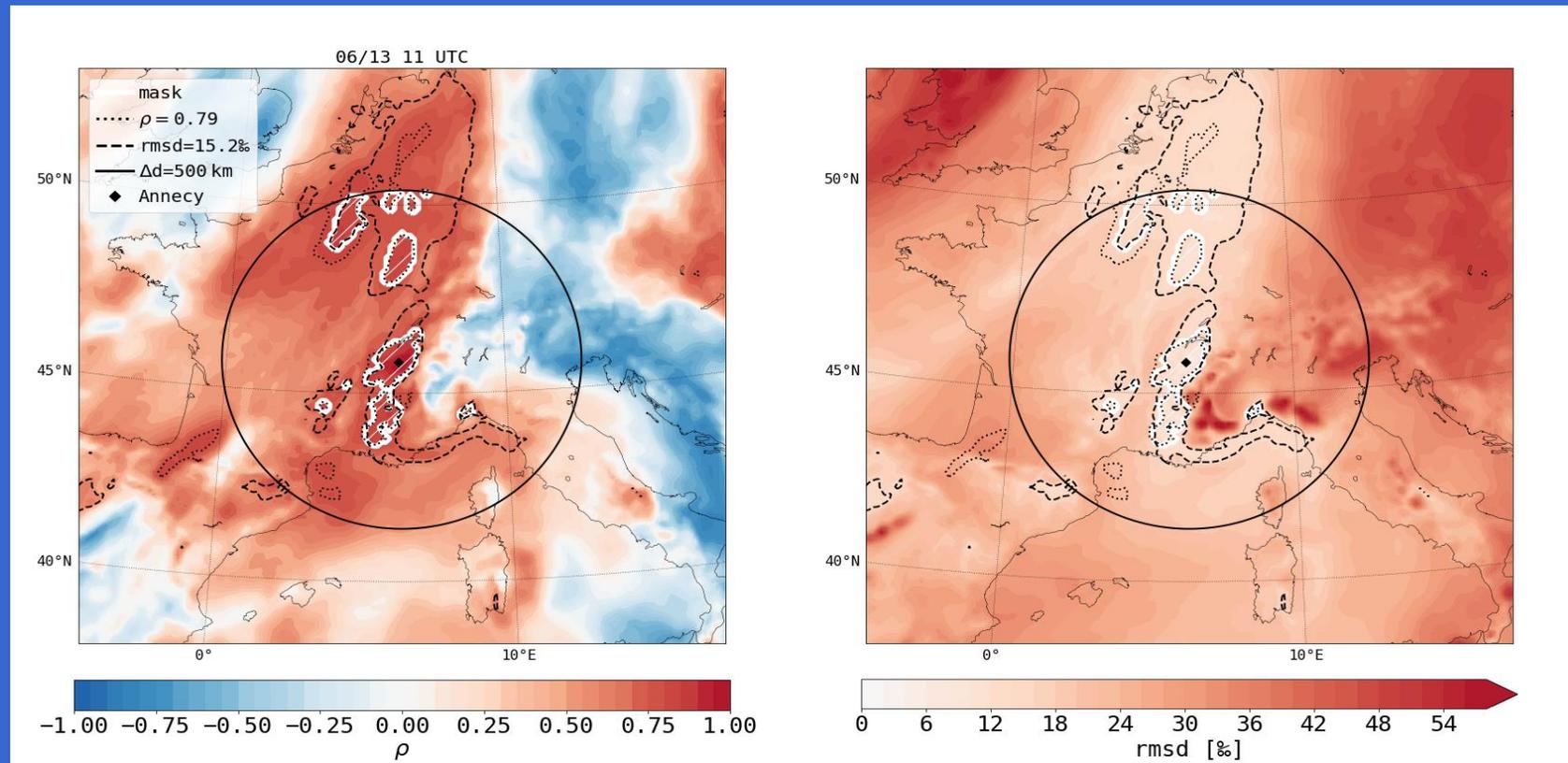
- How representative are in situ measurements for large-scale  $\delta D$  patterns?
- How to use regional COSMOiso simulations to enable a comparison between in-situ and satellite observations?

(Löffler et al. 2021)



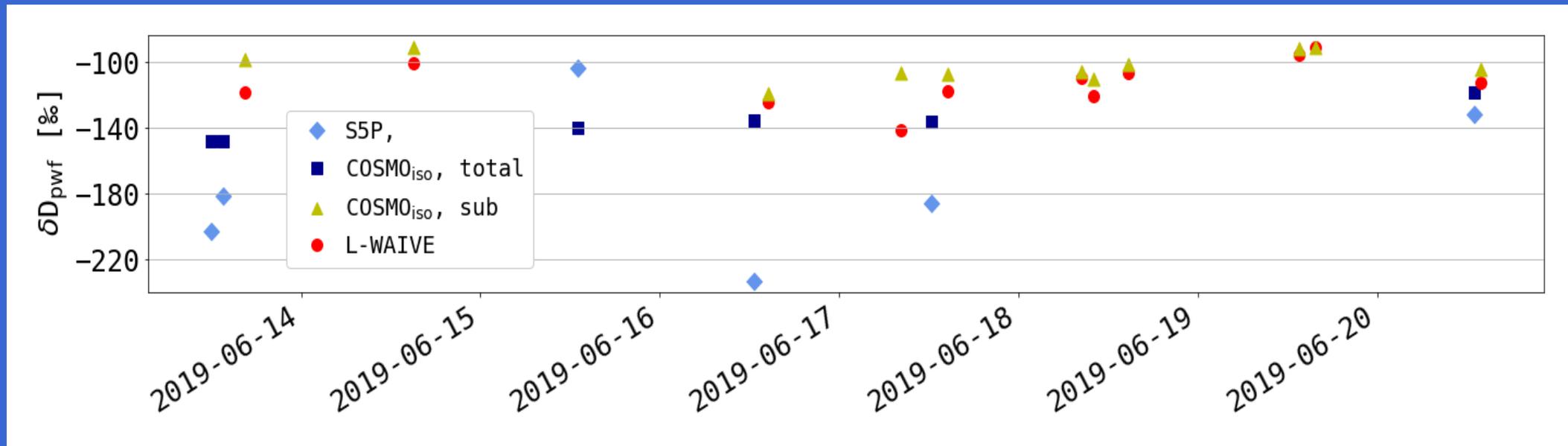
# Scientific case study 1: Scale analysis

- With COSMOiso:
  - Definition of collocation regions
  - Comparison of total and subcolumn  $\delta D$



# Scientific case study 1: Scale analysis

- COSMOiso agrees well with in situ measurements and subcolumn value in boundary layer.
- TROPOMI total column values lower than COSMOiso: underestimation of  $\delta D$  at high altitude by COSMOiso.



# Scientific case study 1: Scale analysis

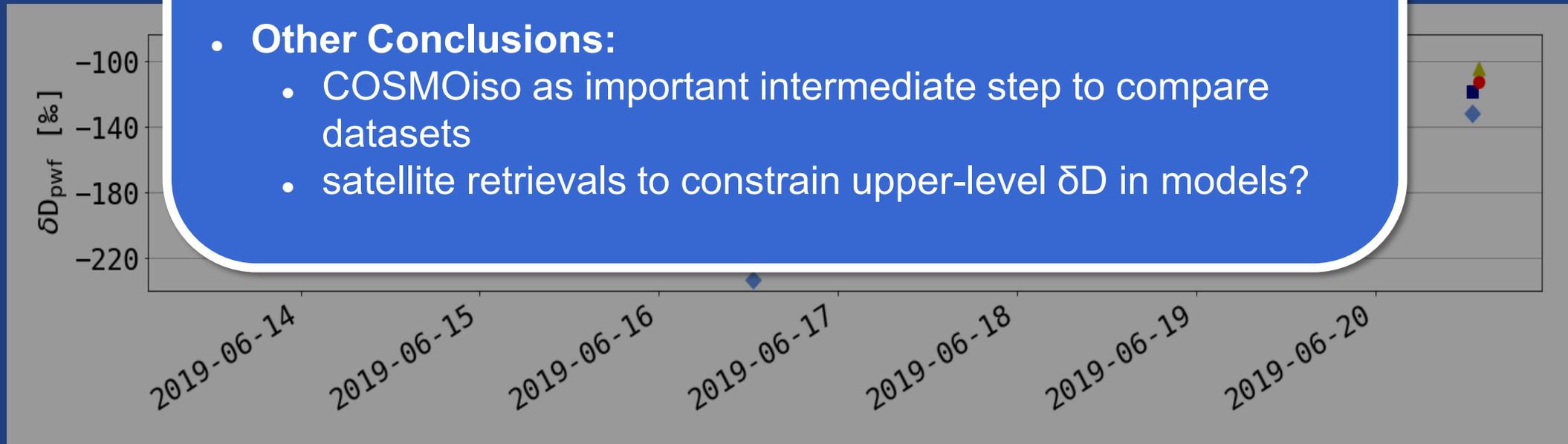
- COSMOiso ... boundary
- TROPOMI ... high
- altitude by

## • Learnings for future campaigns:

- flat terrain vs. topography
- synchronize flights with satellite overpasses (if possible w.r.t to campaign goals)

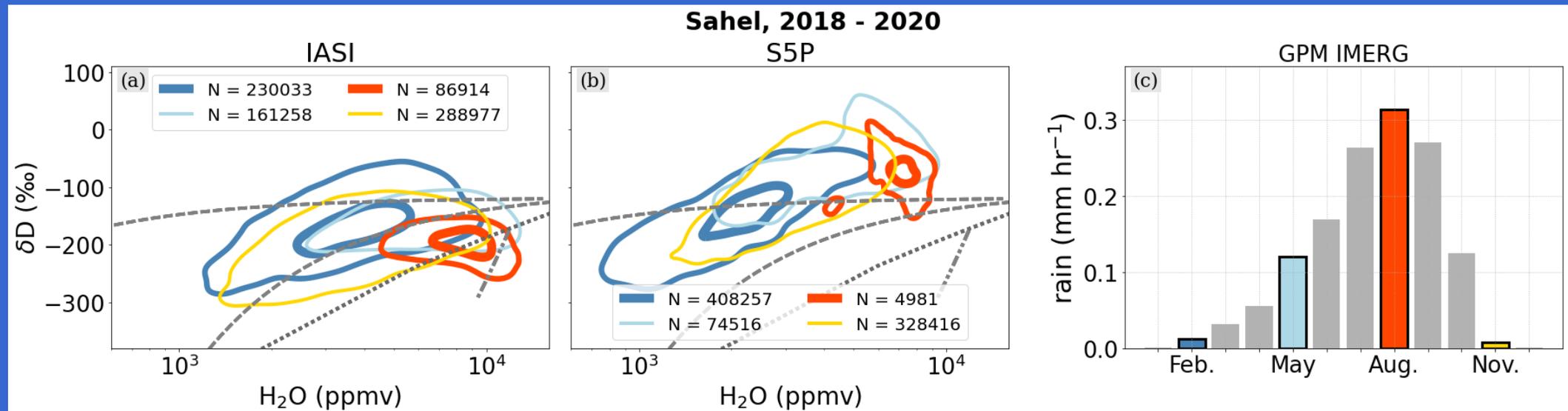
## • Other Conclusions:

- COSMOiso as important intermediate step to compare datasets
- satellite retrievals to constrain upper-level  $\delta D$  in models?



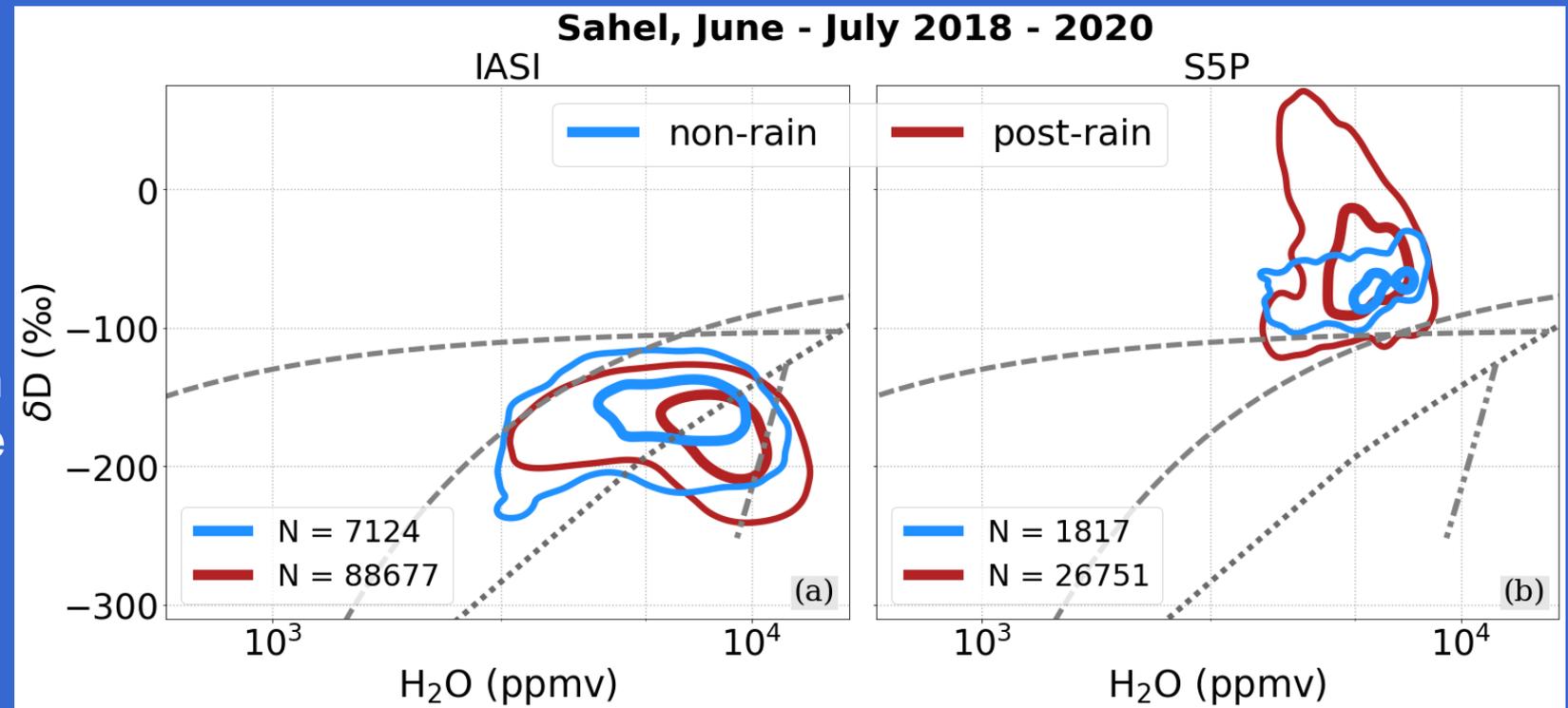
# Scientific case study 2: Complimentary observations

- Quantitative differences in both H<sub>2</sub>O and  $\delta D$ , which arise from different vertical sensitivities of IASI and TROPOMI.
- IASI and S5P show an overall similar annual cycle, from a dry and depleted winter to a moist monsoon summer. Both sensors record an enhanced depletion in  $\delta D$  during summer, which is a result of cloud and rain processes associated with the monsoon convection.
- In addition to that, we observe strongly enriched values in S5P during May and August, which is not reflected in IASI.



# Scientific case study 2: Complimentary observations

- For IASI, we observe a pull towards moister and more depleted H<sub>2</sub>O- $\delta$ D regimes if the observed air masses were affected by convective rain. These features again result from microphysical processes like rain evaporation.
- Interestingly, for S5P we observe some opposite effects: here, convective precipitation has a strongly enriching effect.
- S5P captures effects from the boundary layer, where surface evaporation has strong impact (e.g. convection lifts moisture from the ground).

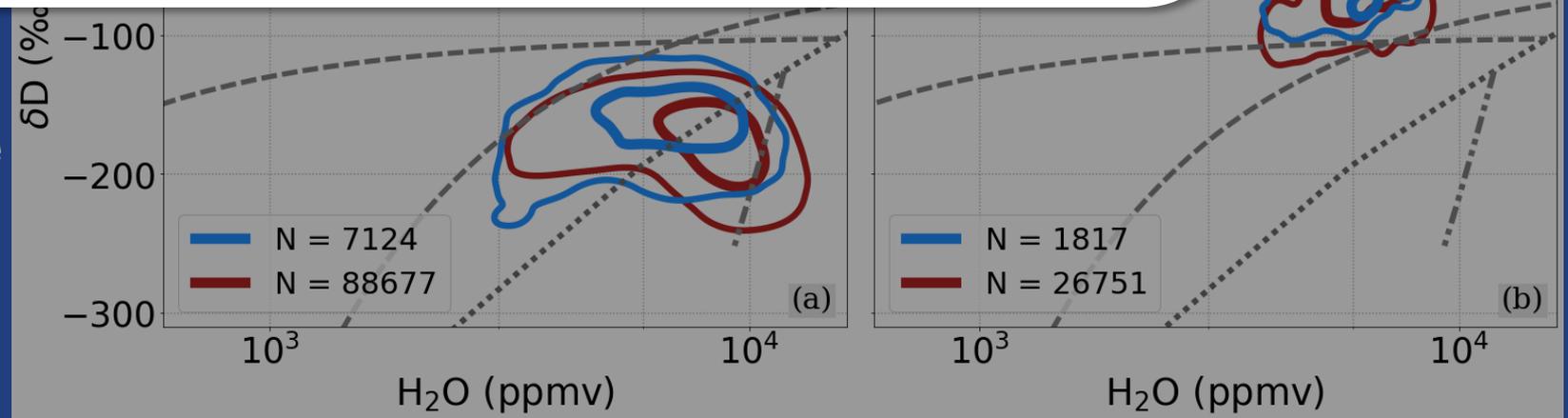


# Scientific case study 2: Complimentary observations

- For IASI, we observe microphysics
- Interesting to observe surface effects: heating, precipitation, strongly enhanced

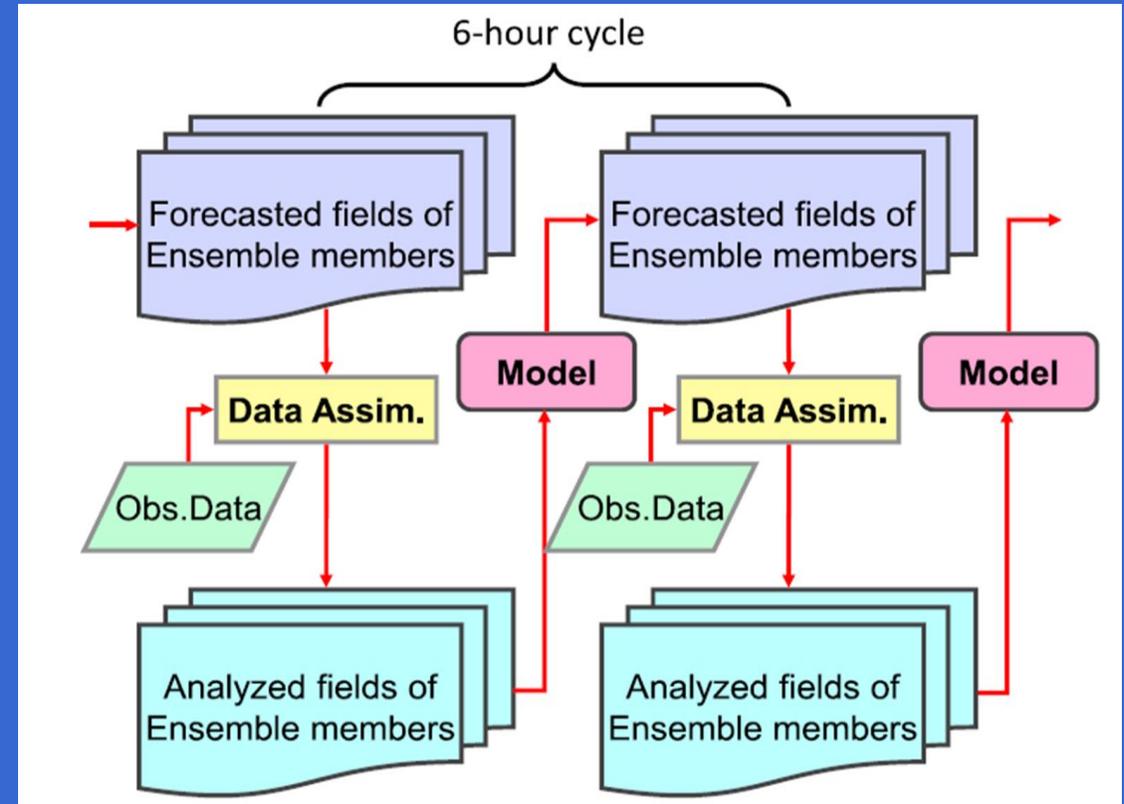
clearly see that TROPOMI adds complementary information that is not reflected in the IASI data, especially about water processes in the boundary layer such as surface evaporation.

- S5P captures effects from the boundary layer, where surface evaporation has strong impact (e.g. convection lifts moisture from the ground).



# Scientific case study 3: Data assimilation

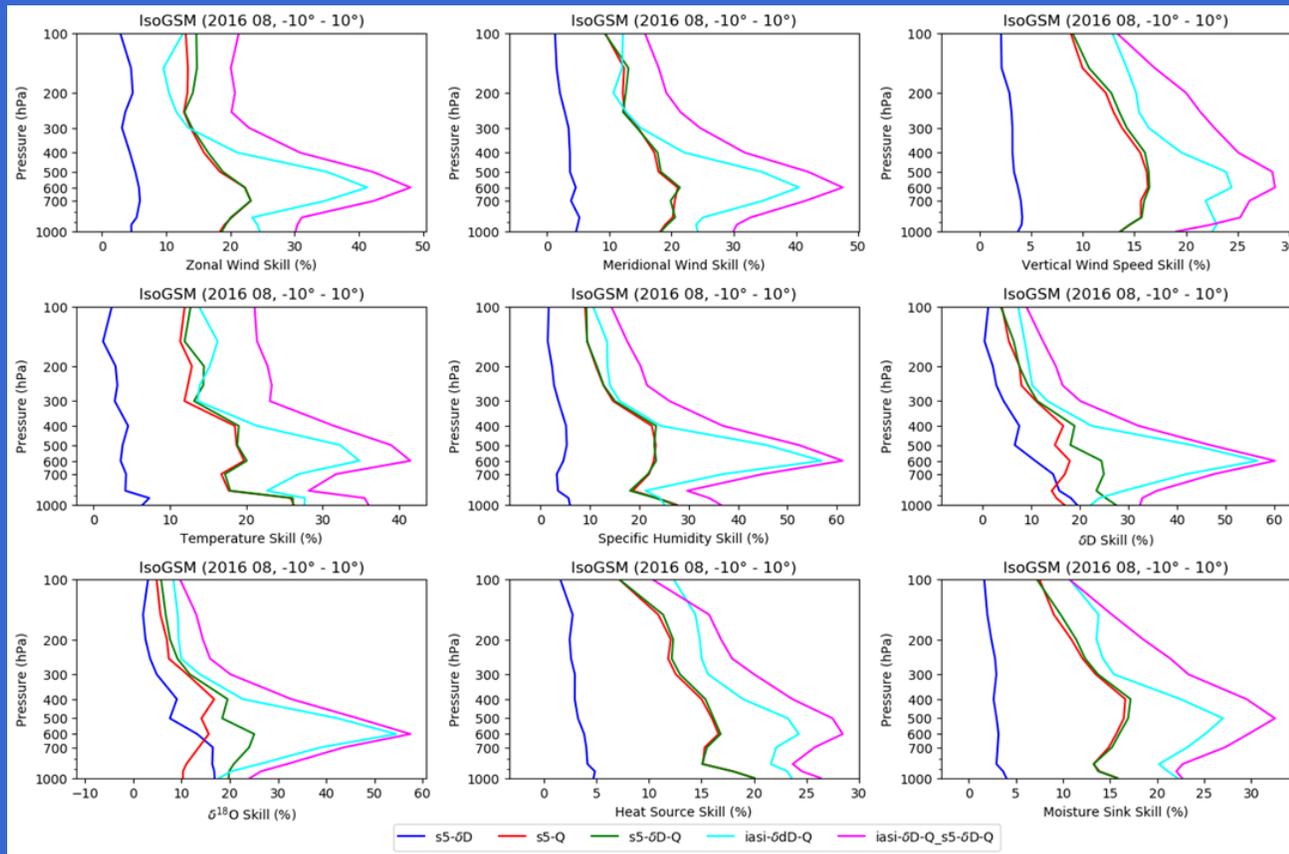
- Assimilation of TROPOMI and IASI  $q$  and  $\delta D$  data into the isotope incorporated model (IsoGSM)
- Observation Simulation Experiment (OSSE)
- Data assimilation with an Local Ensemble Transform Kalman Filter (LETKF)
- Impact assessment of the idealized assimilation experiments done by using the Root-Mean-Square Deviation (RMSD) and Skill



From: Yoshimura et al. (2014)

# Scientific case study 3: Data assimilation

- Skill for the tropics (-10 to 10)



- For all meteorological parameters about 5% improvement is derived when only TROPOMI  $\delta D$  is assimilated.
- Higher improvements (20-40%) can be derived when TROPOMI  $q$  or TROPOMI  $\delta D$  and  $q$  are assimilated.
- The highest improvements of about 35-45% are derived when TROPOMI  $\delta D$  and  $q$  are assimilated together with MUSICA IASI  $\delta D$  and  $q$

# Scientific case study 3: Data assimilation

- Combination of IASI and TROPOMI q and  $\delta D$  information clear benefit for NWP.
- Future work will focus on merging MUSCIA IASI and TROPOMI isotopologue products.
- All case study results can be found in the impact assessment report

S5p+I - H<sub>2</sub>O-ISO  
Validation Report (VR)  
Version 1.3, 2021-09-29



## Sentinel-5p+ Innovation (S5p+I) -Water Vapour Isotopologues (H<sub>2</sub>O-ISO)

Impact Assessment Report (IAR)

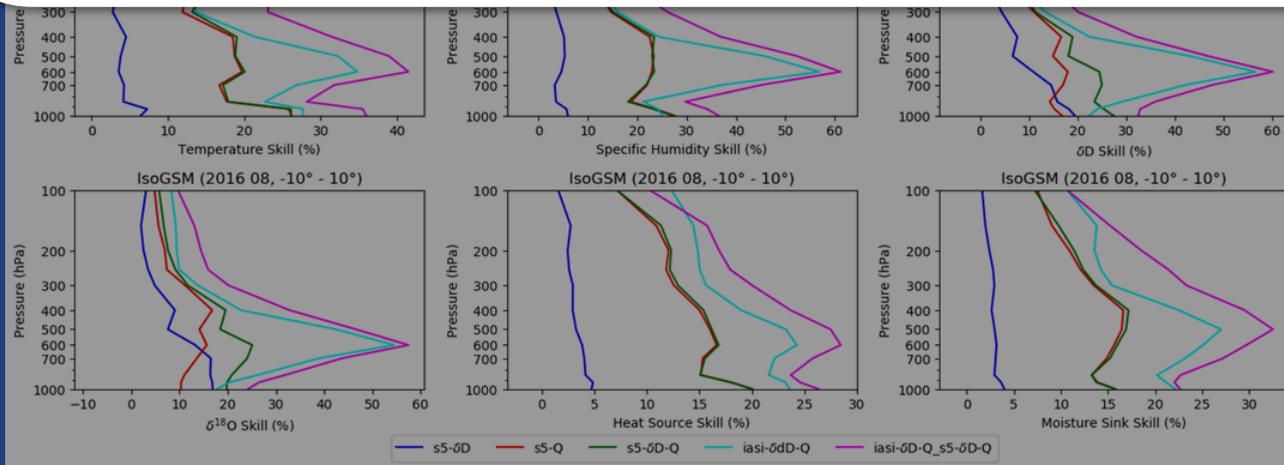
Date:  
26.10.2021

Authors:

Iris Thurnherr, Harald Sodemann, Geophysical Institute, University of Bergen, and Bjerknes Center for Climate Research, Bergen, Norway  
Matthias Schneider, Christopher Diekmann, Amelie Ninja Röhlung and Farahnaz Khosrawi: Institute of Meteorology and Climate Research (IMK-ASF), Karlsruhe Institute of Technology, Karlsruhe, Germany  
Tim Trent and Hartmut Bösch: School of Physics and Astronomy, University of Leicester, Leicester and National Centre for Earth Observation NCEO, United Kingdom

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European Space Agency  
Agence spatiale européenne



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# Summary

- Now produced 3 years of UoL prototype TROPOMI stable water vapour isotopologue product.
- The TROPOMI X $\delta$ D mean bias with respect to the ground-based FTIR data is about -21 ‰  $\pm$  36.5 ‰ and -1.9 ‰  $\pm$  35.2 ‰ after bias correction.
- Different dependencies on influence quantities can be observed (e.g. water vapour content in the atmosphere and albedo).
- Simulations with isotope-enabled NWP models are a key asset during such validation studies, and provide both larger spatial and temporal context, serve as verification target, and enable synthetic verification studies.
- S5P spatial and temporal coverage highly useful for deciphering the interrelation between weather situations and the isotopic state of atmospheric water vapour.
- Potential for the assimilation of data from both instruments together for improving meteorological analysis and thus weather forecasts.

# Thank you for Listening.



Further information can be found at:  
<https://s5pinnovationh2o-iso.le.ac.uk/>



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