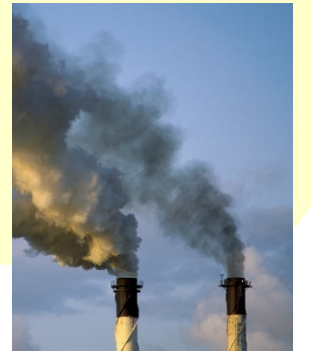
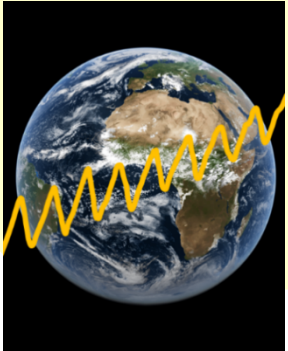


IWGGMS-15, 3-5 June 2019, Sapporo, Hokkaido, Japan

Generation of merged Level 2 and Level 3 XCO₂ data products from SCIAMACHY/ENVISAT, GOSAT and OCO-2 for the Copernicus Climate Change Service



Michael Buchwitz, Maximilian Reuter, Oliver Schneising, Stefan Noël,
Heinrich Bovensmann, John P. Burrows



Satellite CO₂ and CH₄ CCI & Copernicus projects

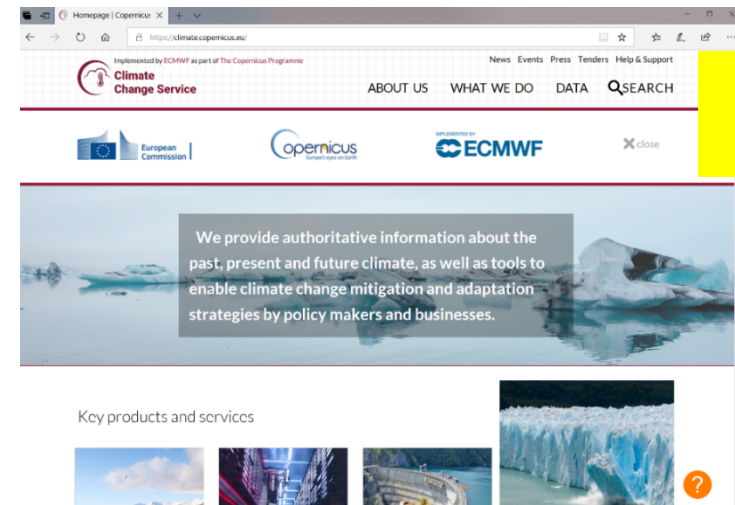
GHG Essential Climate Variable (ECV) products / Climate Data Records (CDR):

www.esa-ghg-cci.org/

<https://climate.copernicus.eu/>



GHG-CCI

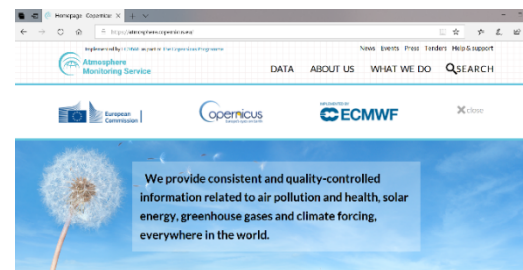


C3S

Since 1-March-2019: **GHG-CCI+**

R&D to generate new / improved ECV
XCO₂ and XCH₄ products
(OCO-2, TanSat, GOSAT-2,
Sentinel-5-Precursor)

Near-real-time:

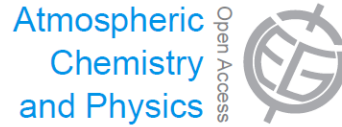


CAMS

<https://atmosphere.copernicus.eu/>
www.iup.uni-bremen.de/~ghguser/

Merged Level 2 & Level 3 products (XCO₂ & XCH₄)

Atmos. Chem. Phys., 13, 1771–1780, 2013
www.atmos-chem-phys.net/13/1771/2013/
doi:10.5194/acp-13-1771-2013
© Author(s) 2013. CC Attribution 3.0 License.



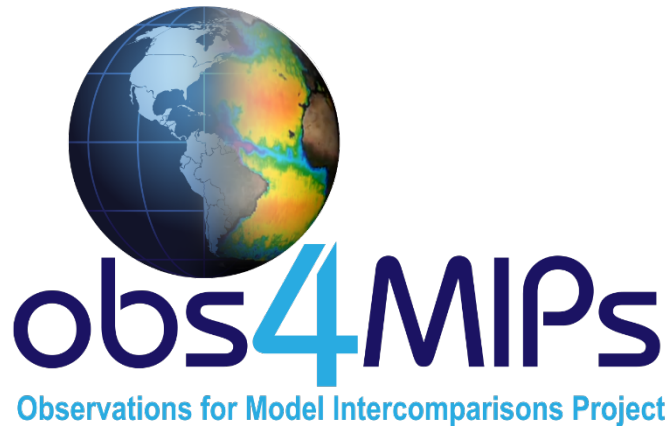
Reuter et al., 2013

A joint effort to deliver satellite retrieved atmospheric CO₂ concentrations for surface flux inversions: the ensemble median algorithm EMMA

M. Reuter¹, H. Bösch², H. Bovensmann¹, A. Bril³, M. Buchwitz¹, A. Butz⁴, J. P. Burrows¹, C. W. O'Dell⁵, S. Guerlet⁶, O. Hasekamp⁶, J. Heymann¹, N. Kikuchi³, S. Oshchepkov³, R. Parker², S. Pfeifer⁷, O. Schneising¹, T. Yokota³, and Y. Yoshida³

Why ?

- Some users want an **easy to use** product covering an as long as possible time period
- **Improved data quality** (potentially) – for certain applications such as regional-scale inverse modelling and climate model comparisons - by selecting „the best“ products from an ensemble of products



<https://esgf-node.llnl.gov/projects/obs4mips/>

Merged Level 2 product:

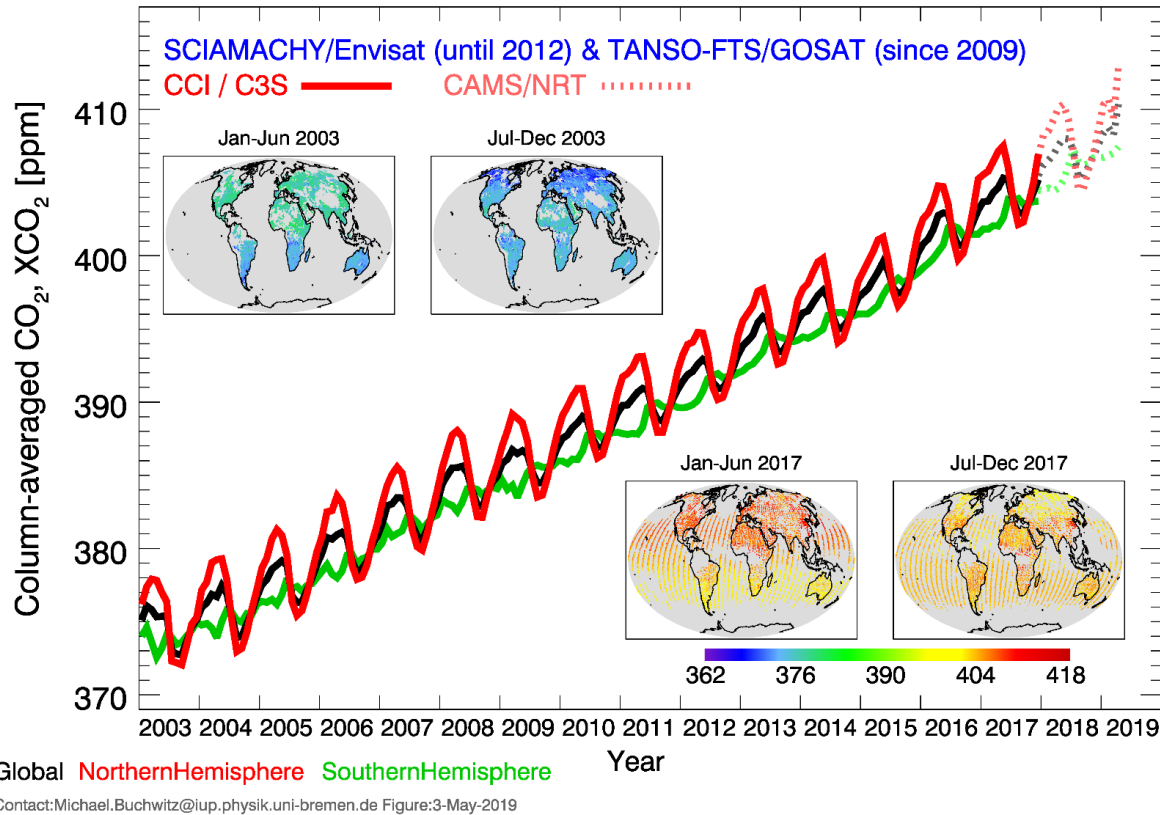
- Algorithm: **EMMA**
- Satellite input data: Individual sensor L2 products (European (CCI & C3S) and non-European (NIES, NASA))
- Format: NetCDF/GHG-CCI (nearly identical with NASA XCO₂ Lite)

Merged Level 3 product:

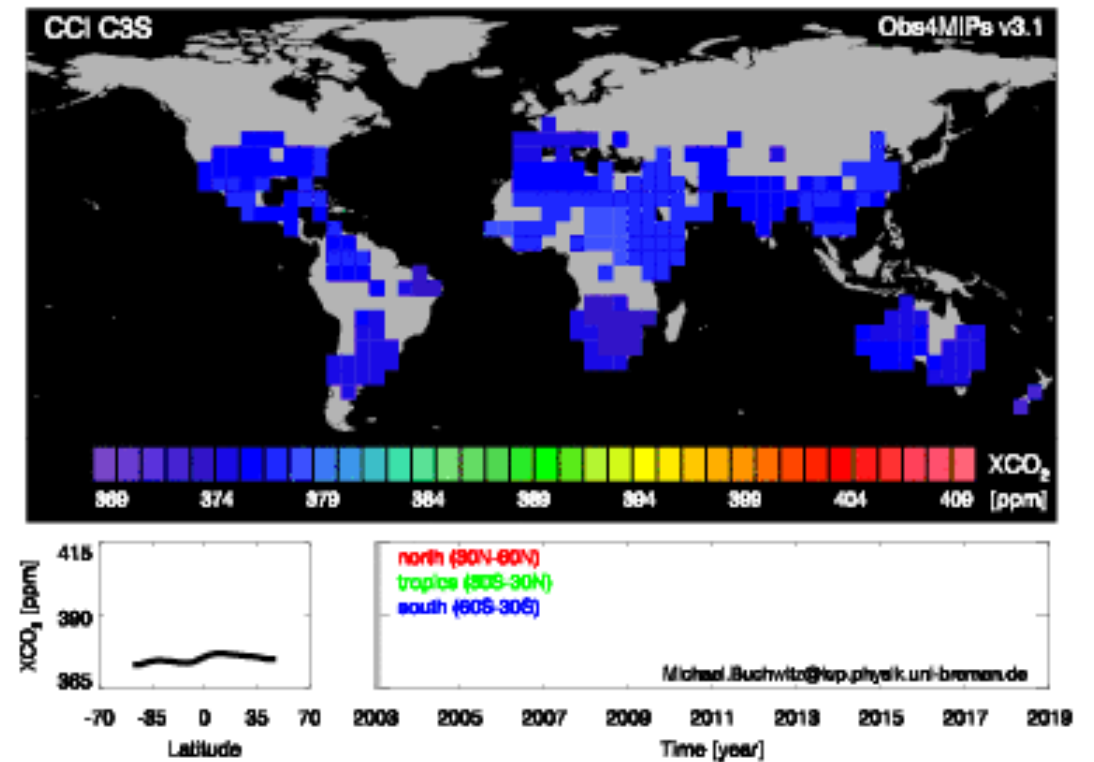
- Gridding of EMMA product: 5°x5°, monthly
- Format: **Obs4MIPs** (convenient for climate model comparisons)

XCO₂ merged products: L2/EMMA & L3/Obs4MIPs

Atmospheric Carbon Dioxide (CO₂) from Satellites



Carbon Dioxide SCIAMACHY/ENVISAT TANSO-FTS/GOSAT 2003 01

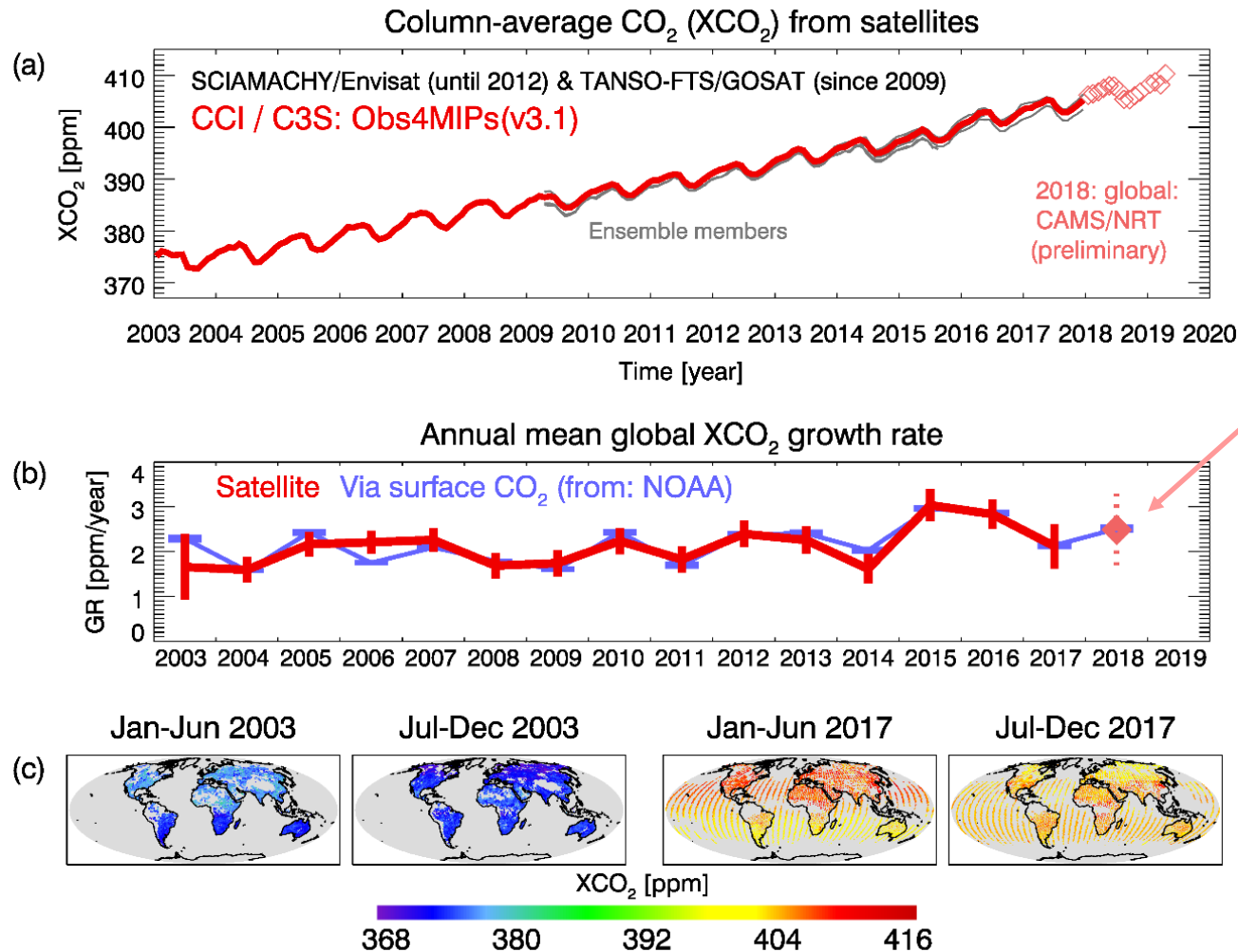


Latest version: v3.1 EMMA & Obs4MIPs, 2003-2017, from ensemble of SCIAMACHY & GOSAT-1 Level 2 products

In preparation: v4, 2003-2018, SCIAMACHY, GOSAT-1, **OCO-2**

-> Preliminary results („v4/beta“) are shown in this presentation (e.g., 2018 data not yet included)

XCO₂ annual growth rates



2018 CO₂ growth rate estimate (ppm / year):

Column CO₂ (XCO₂):

Satellite XCO₂ (preliminary): **2.5 +/- 0.8**

Algorithm: Buchwitz et al., ACP, 2018

See also:

European State of the Climate 2018
(<https://climate.copernicus.eu/ESOTC>)

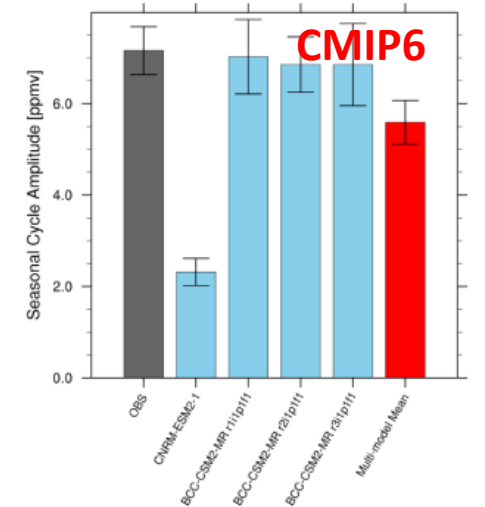
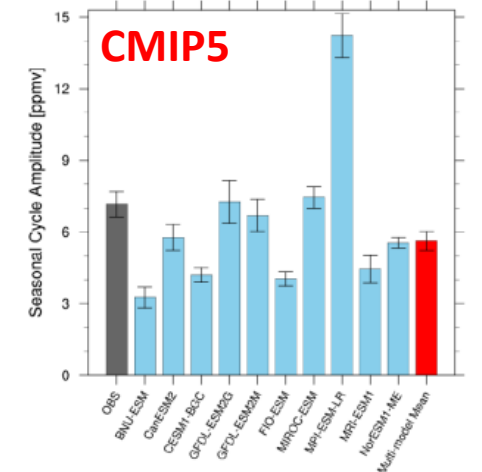
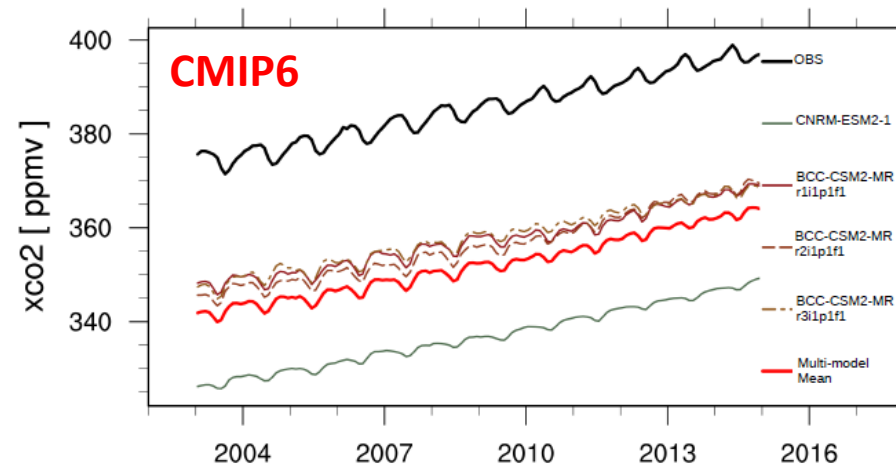
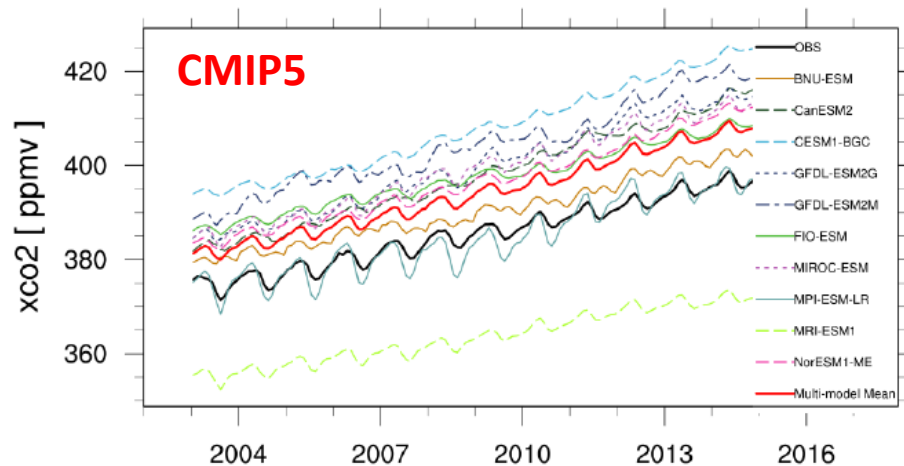
Surface CO₂:

NOAA: Global marine: **2.51 +/- 0.09**

Satellite XCO₂: Comparisons with climate models

Satellite XCO₂ vs emission driven climate models

C3S/CCI XCO₂_OBS4MIPS **Multi-Model Mean**



Changes of Growth Rate and Seasonal Cycle Amplitude of Column CO₂ in CMIP5&6 models and Satellite Data



Bettina K. Gier^{1,2}, Michael Buchwitz¹, Veronika Eyring^{2,1}, Maximilian Reuter¹, Peter M. Cox³, and Pierre Friedlingstein³

¹ University of Bremen, Institute of Environmental Physics (IUP), Bremen, Germany

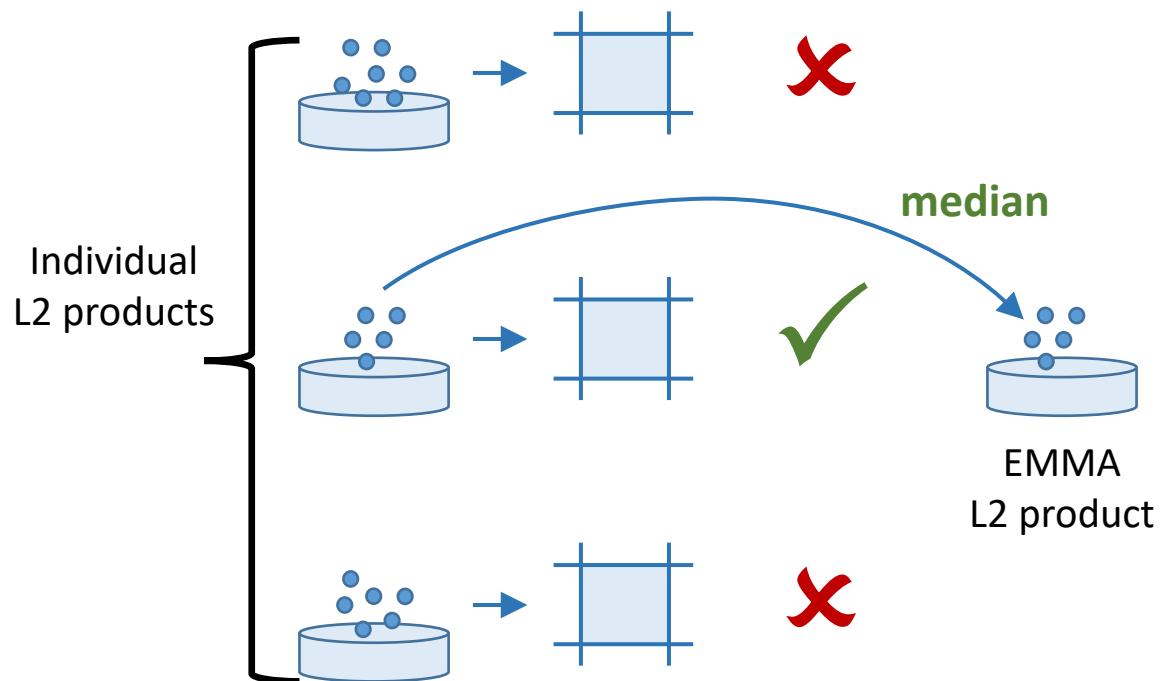
² Deutsches Zentrum für Luft- und Raumfahrt (DLR), Institut für Physik der Atmosphäre, Oberpfaffenhofen, Germany

³ College of Engineering, Mathematics and Physical Sciences, University of Exeter, Exeter, UK.



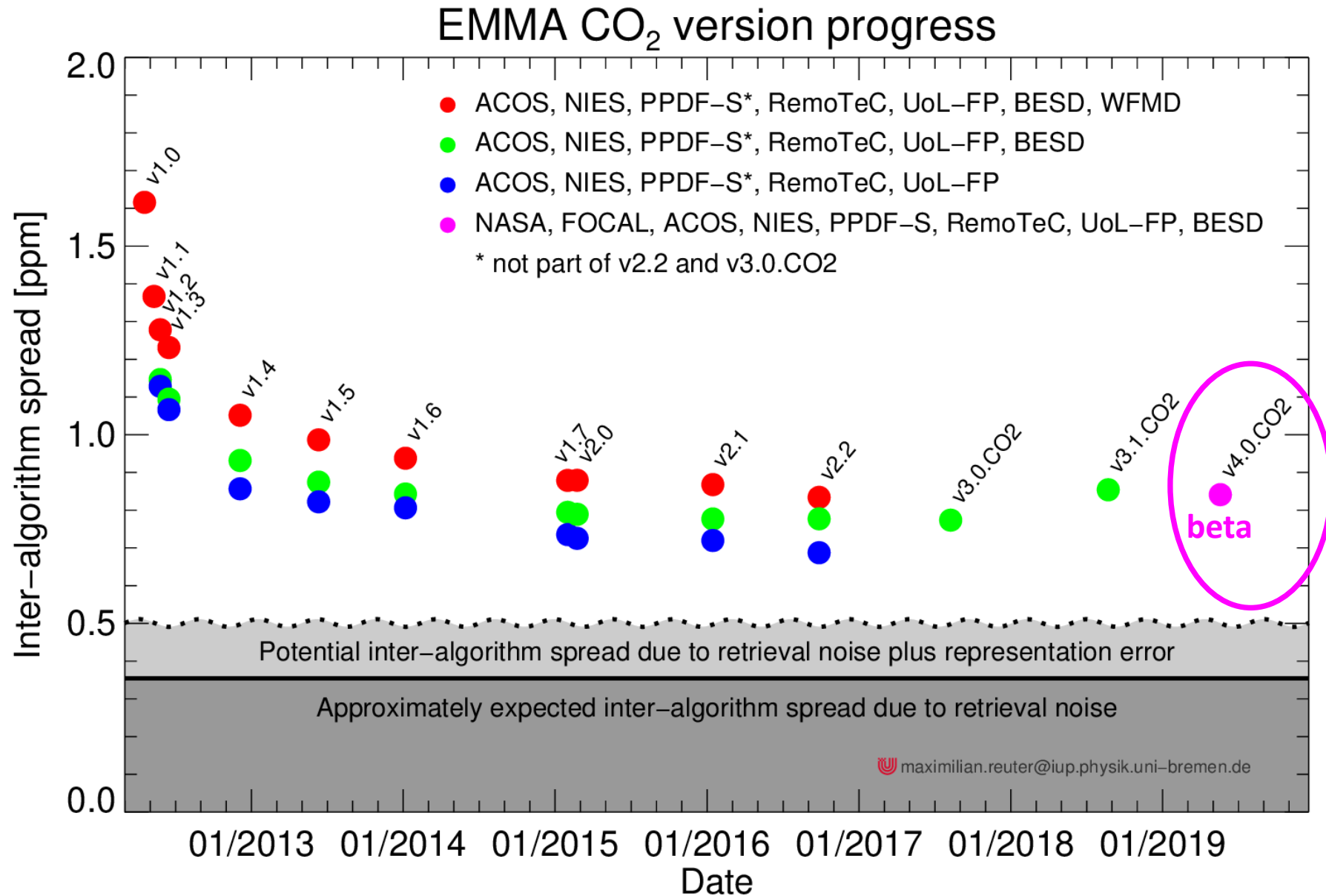
EMMA: Purpose & basic idea

- **Purpose:** To generate an easy to use high-quality Level 2 product covering an as long as possible time period (currently (v3.1): 2003-2017; soon (v4): 2003-2018; each year extended by 1 year)
- **Input data:** Ensemble of Level 2 XCO₂ (and XCH₄) products
- **Algorithm:** Determines **monthly** averages in **10°x10°** grid cells, selects the **median**, and stores the corresponding individual soundings in a data base:



- Harmonization w.r.t. *a priori*, offset correction, ...
- Thresholds depending on potential information content to prevent from over-weighting individual algorithms.
- Requires a consistent validation of all contributing XCO₂ (or XCH₄) data sets and their reported uncertainties; EMMA is therefore also a data quality assessment tool.

EMMA XCO₂: version progress



To be done for v4:

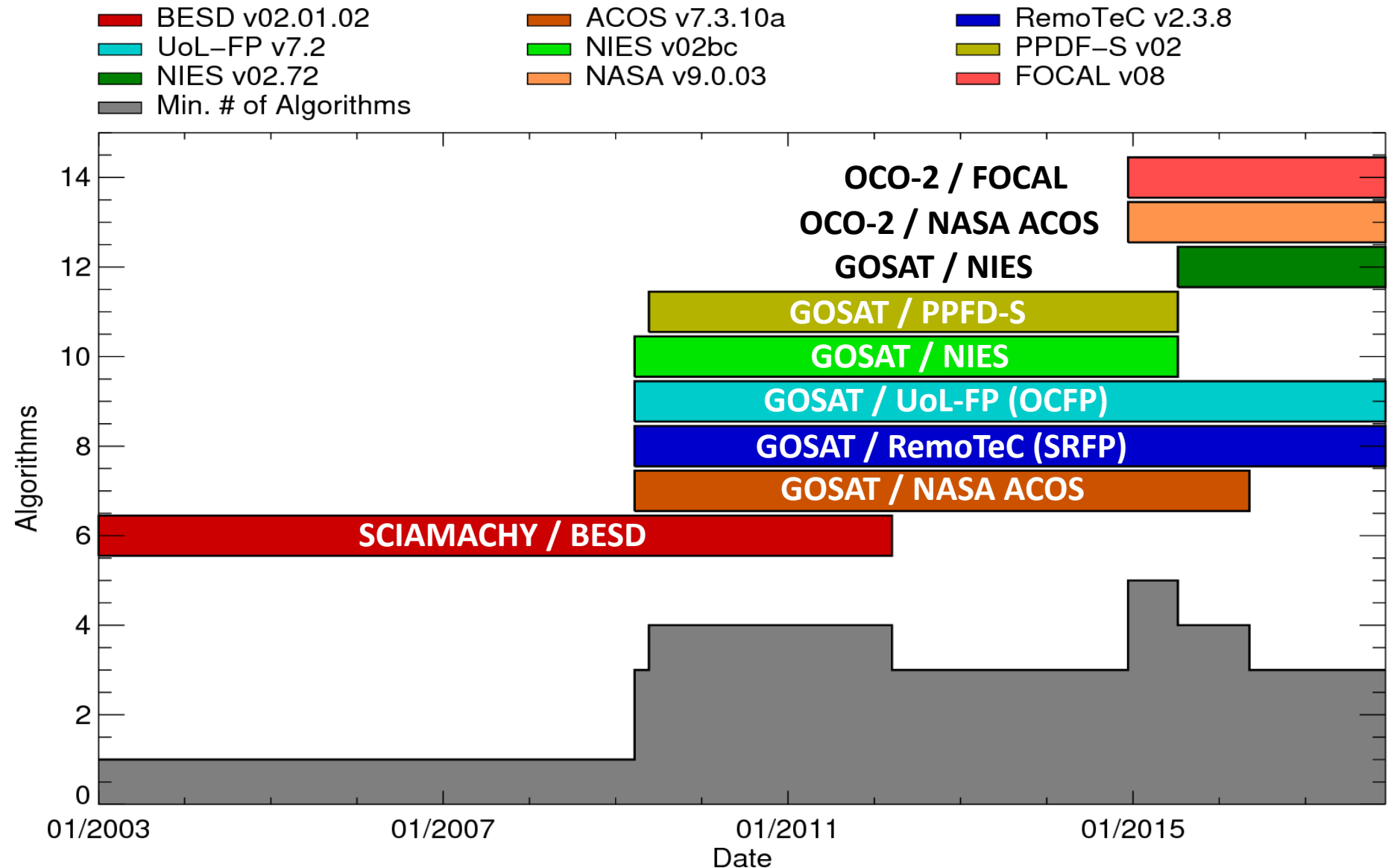
- Update for latest versions
- Adding year 2018

EMMA XCO₂ v4/beta: Contributing Level 2 products

Here: EMMA XCO₂
v4/beta

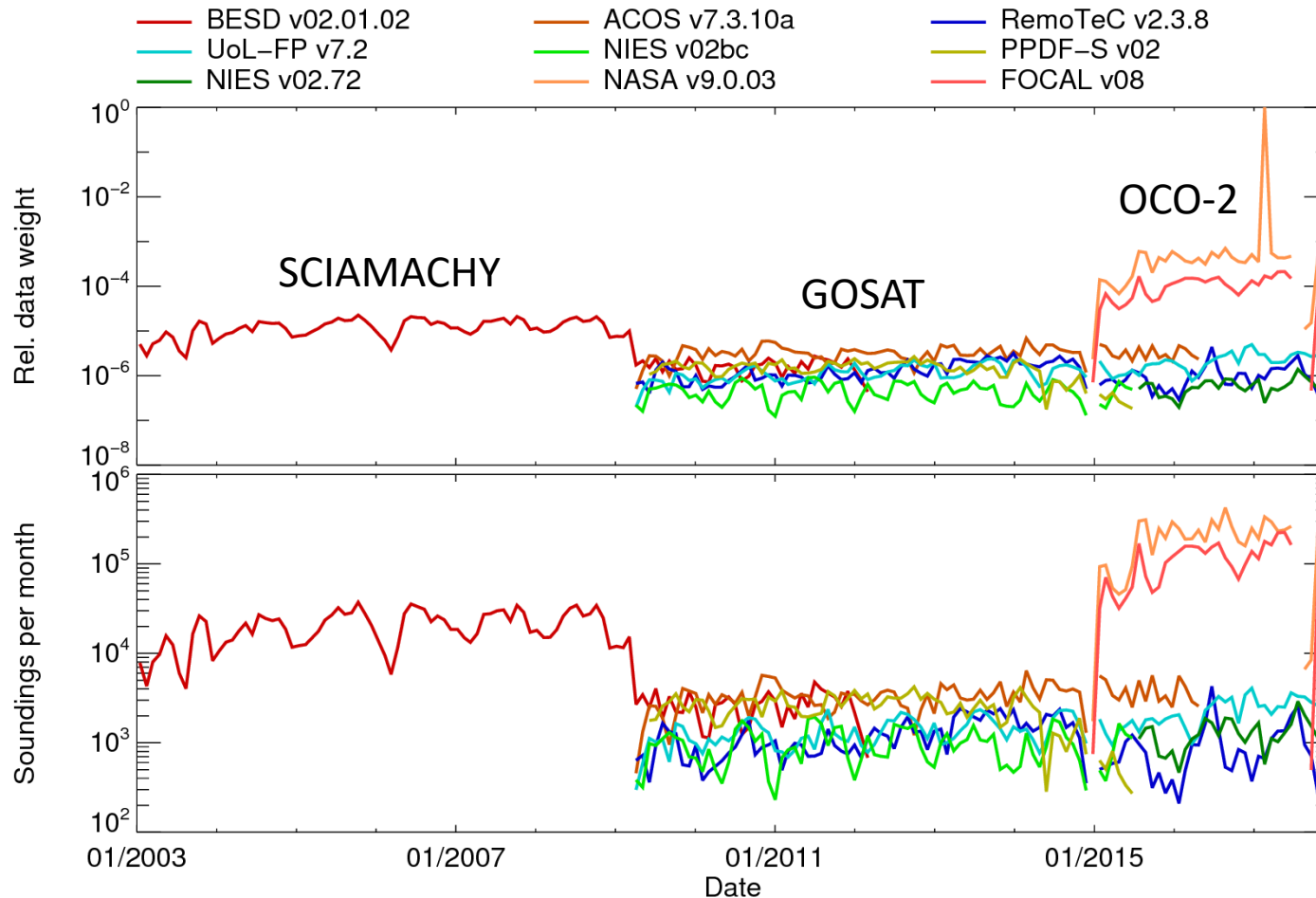
To be done for v4:

- Update for latest versions
- Adding year 2018



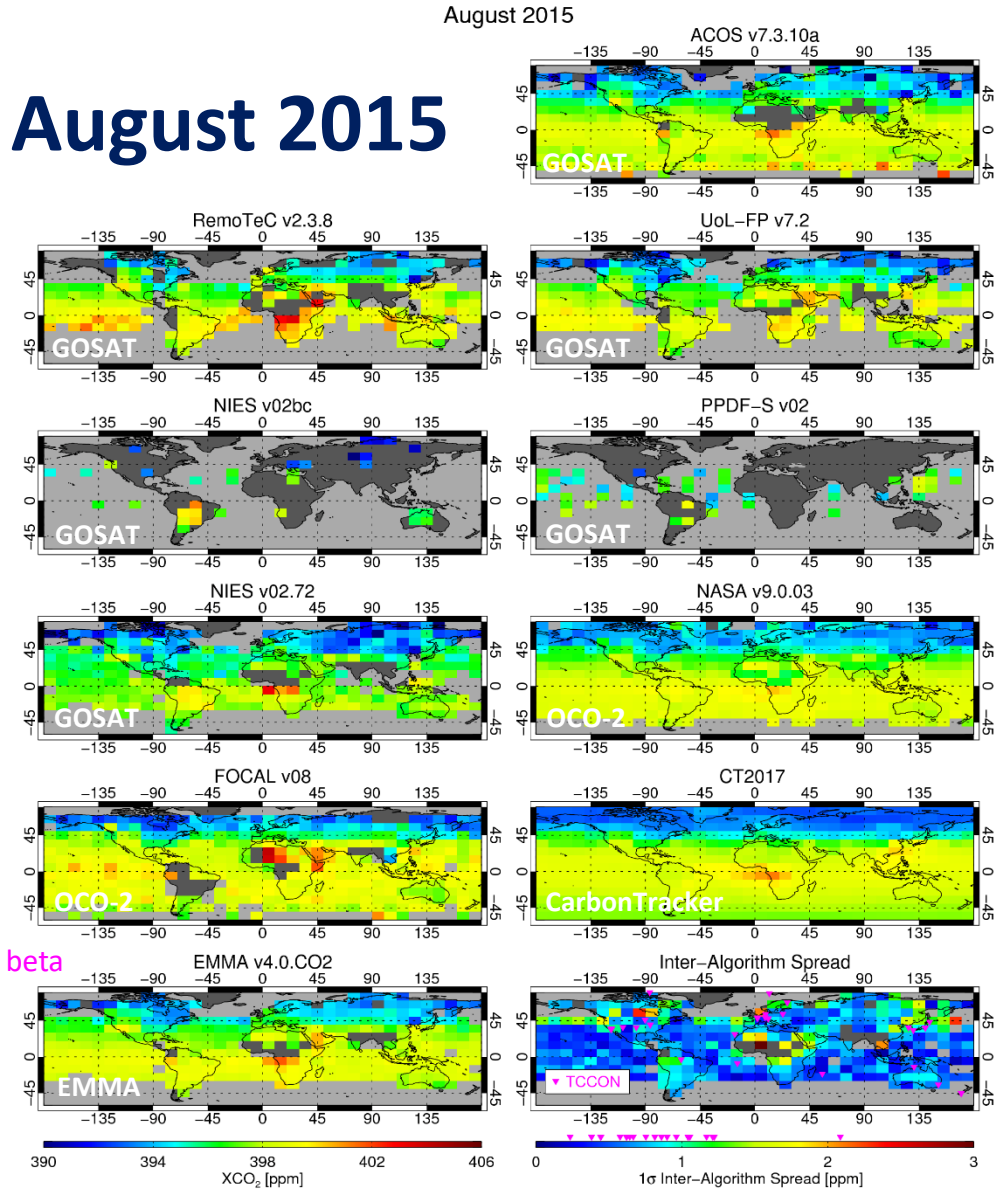
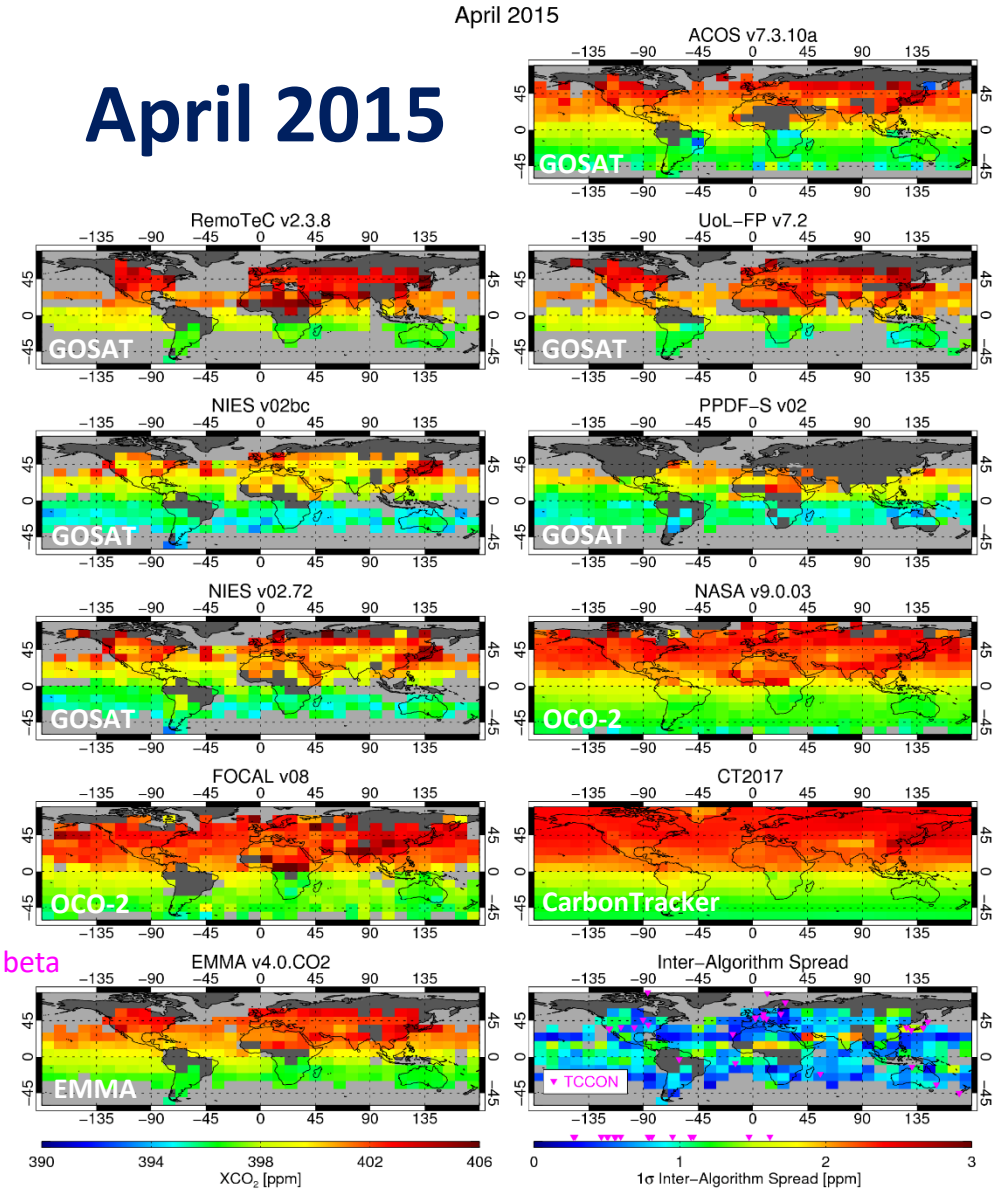
EMMA XCO₂ v4/beta: Algorithm/product contributions

Contributions to EMMA: Rel. data weight & Nobs/month

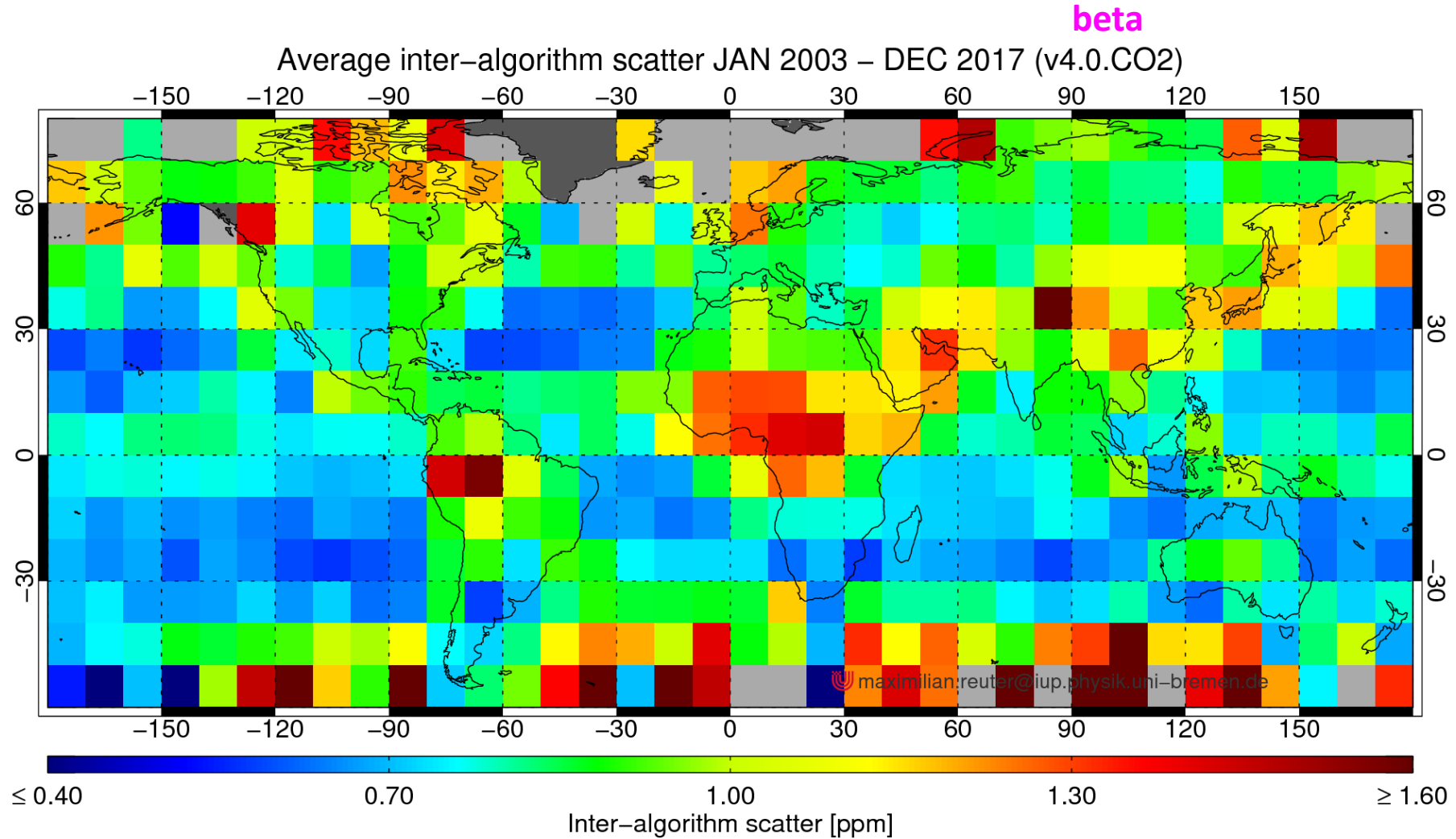


- OCO-2 algorithms (esp. **NASA ACOS**) with most soundings per month and largest “relative data weight” (= approx. variance weighted number of observations)
- Contains not the latest version of the **GOSAT NIES** data and we did a mistake by not using the bias corrected data -> EMMA will be updated to improve on this

EMMA XCO₂ v4/beta: Comparison of monthly XCO₂ maps



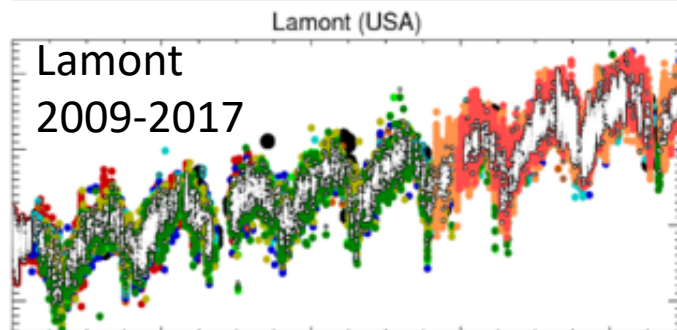
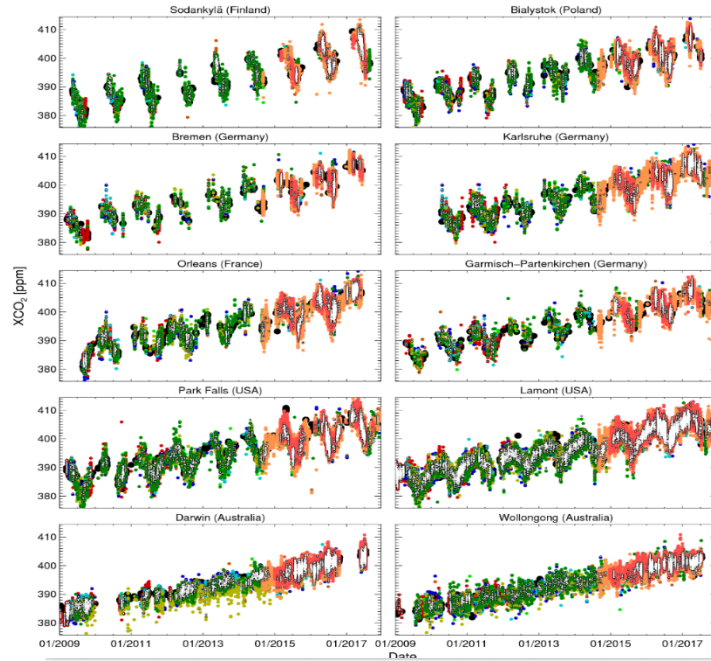
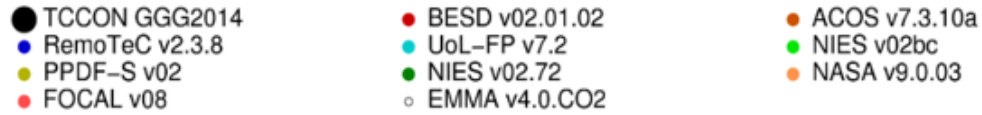
EMMA XCO₂ v4/beta: „Inter-algorithm scatter“



Good agreement

Poorer agreement

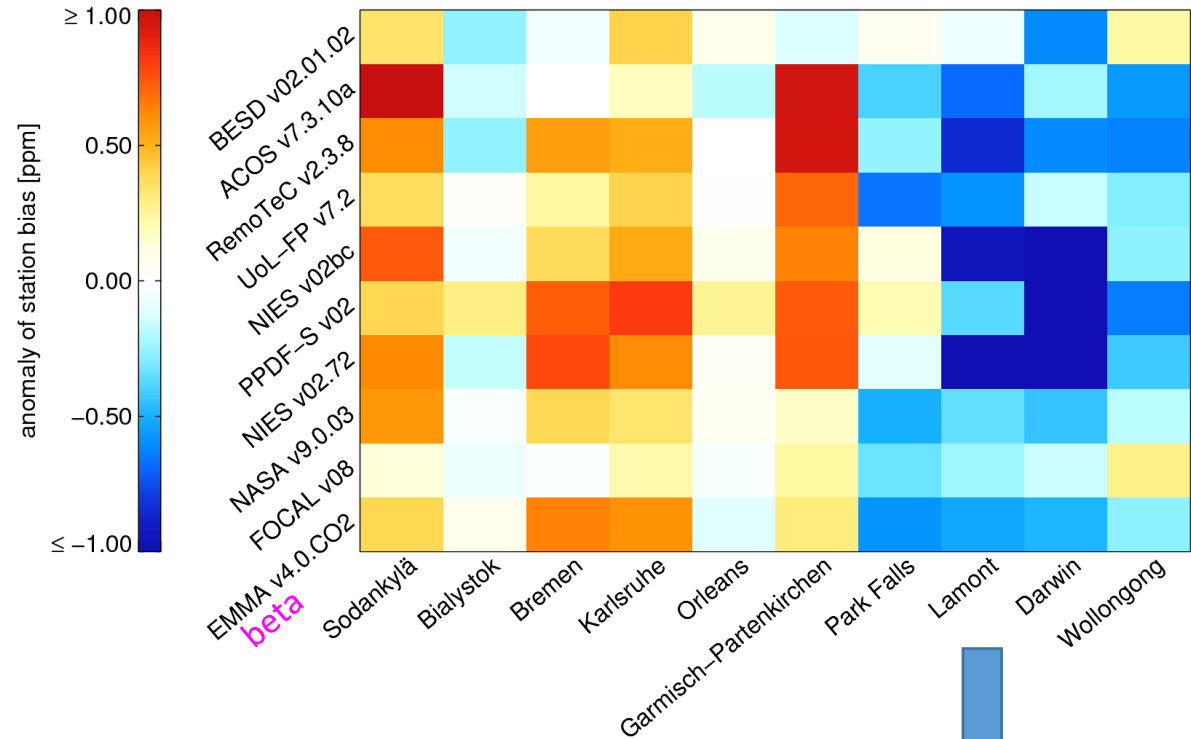
EMMA XCO₂ v4/beta: Comparison with TCCON



- EMMA (white circles): „In the middle“ as expected

Anomaly of station bias:

(sum of each row = 0)



@Lamont:

- (All) Satellite products have low bias?
- OR: TCCON/GGG2014 has high bias?
- OR: Mixture?

Note: TCCON GGG2014 site-to-site accuracy/bias: 0.8 ppm (2 σ) (e.g., Hedelius et al., AMT, 2017)

XCO₂@TCCON: mean differences

Satellite – TCCON:

Two satellites, several XCO₂ products & different assessment methods
(C3S CDR#2 2003-2017; EMMAv3.1 (SCIA & GOSAT), ...)



TCCON site	Satellite product												Mean diff. Sat-TCCON [ppm]	StdDev [ppm]	Satellite bias ?	TCCON site
	XCO2 difference Satellite minus TCCON in ppm:															
	Reference															
	CO2_SCI_BESD QAQC	CO2_SCI_WFMD QAQC	CO2_GOS_OCFP QAQC	CO2_GOS_SRFP QAQC	XCO2_EMMA QAQC	CO2_GOS_OCFP DP	CO2_GOS_SRFP DP	CO2_GOS_ACOS EMMA	CO2_GOS_SRFP EMMA	CO2_GOS_OCFP EMMA	XCO2_EMMA EMMA					
Main_Fig_10	Main_Fig_12	Main_Fig_14	Main_Fig_16	Main_Fig_18	A_Tab_3	B_Fig_3	D txt file	D txt file	D txt file	D txt file						
Ascension I.			-0,25		0,05											Ascension I.
Bialystok	-0,07	0,69	0,07	0,03	0,24	0,12	-0,15	-0,15	-0,26	0,01	-0,18	0,03	0,25			Bialystok
Bremen	0,06	1,00	0,32	0,85	0,87	0,29	0,65	-0,01	0,53	0,22	0,51	0,48	0,32	High bias ?		Bremen
Darwin	-0,11	-0,49	0,28	0,22	0,19	0,19	-0,02	-0,20	-0,55	-0,12	-0,74	-0,12	0,33			Darwin
Garmisch	-0,23	0,63	0,59	1,09	0,69	0,71	0,45	0,95	0,94	0,68	0,50	0,64	0,33	High bias ?		Garmisch
Izana				-0,62	-0,75											Izana
Karlsruhe			0,50	1,19	0,94	0,45	0,36	0,16	0,47	0,38	0,40	0,54	0,30	High bias ?		Karlsruhe
Lamont	-0,11	-0,13	-0,45	-0,44	-0,10	-0,49	-0,40	-0,68	-0,84	-0,57	-0,56	-0,43	0,23	Low bias ?		Lamont
Paris			-1,13	-0,45	-0,97							-0,85	0,29	Low bias ?		Paris
Park Falls	-0,15	0,76	-0,61	0,31	0,43	-0,40	0,28	-0,40	-0,27	-0,67	-0,08	-0,07	0,44			Park Falls
Reunion I.			0,23		0,23											Reunion I.
Saga			-0,10	0,68	0,59	0,05	0,58					0,36	0,32	High bias ?		Saga
Sodankyla	0,25	0,54	0,44	0,58	1,00	0,54	0,80	1,05	0,58	0,36	0,70	0,62	0,24	High bias ?		Sodankyla
Wollongong	0,52	-0,37	0,09	0,53	0,61	0,03	-0,02	-0,53	-0,59	-0,26	-0,45	-0,04	0,42			Wollongong

E.g., **Lamont**: Mean difference SAT-TCCON +/- StdDev: **-0.43 +/- 0.23 ppm**

This suggest one of the following:

- Low bias satellites?: -0.43 +/- 0.23 ppm
- High bias TCCON GGG2014 Lamont?: +0.43 +/- 0.23 ppm
- Mixture?

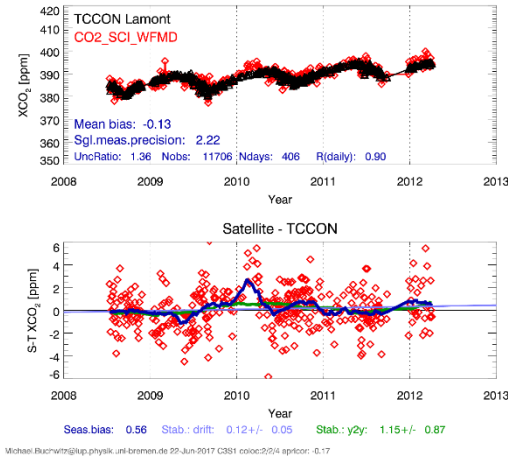
Note: TCCON GGG2014 site-to-site accuracy/bias: 0.8 ppm (2σ) (e.g., Hedelius et al., AMT, 2017)

Product Quality Assessment Report XCO₂@Lamont: trend of differences

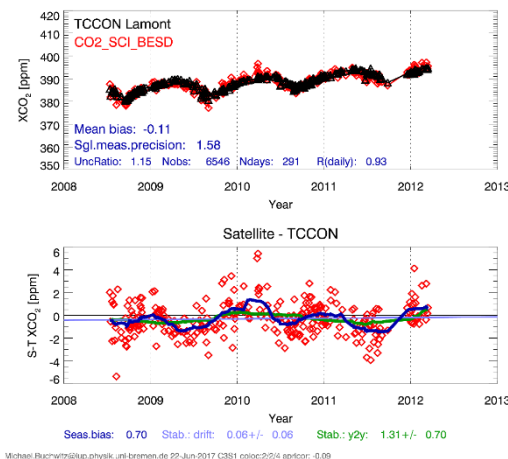
(PQAR) – Main document
for data set CDR 2 (2003-2017)



CO2_SCI_WFMD v02.01.02
Trend: +0.12 +/- 0.05 ppm/year



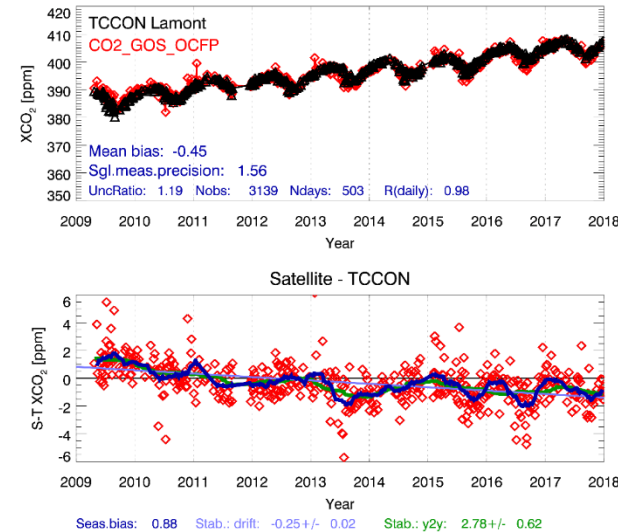
CO2_SCI_BESD v02.01.02
Trend: +0.06 +/- 0.06 ppm/year



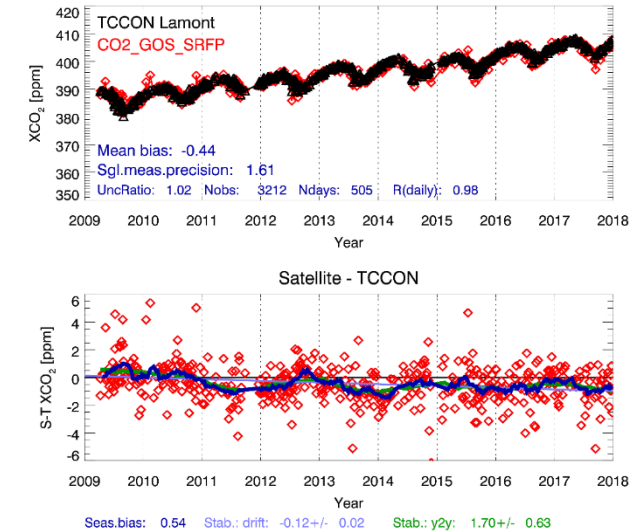
SCIAMACHY: No clear trend

Satellite vs TCCON:

CO2_GOS_OCFP (UoL-FP) v7.2
Trend: -0.25 +/- 0.02 ppm/year



CO2_GOS_SRFP (RemoTeC) v2.3.8
Trend: -0.12 +/- 0.02 ppm/year



Low bias trend GOSAT XCO₂ (approx. -0.18 ppm/year) ?
OR
High bias trend TCCON GGG2014 Lamont (+0.18 ppm/year)?
OR
Mixture ?

Note: TCCON GGG2014 site-to-site accuracy/bias: 0.8 ppm (2σ) (e.g., Hedelius et al., AMT, 2017)

Product Quality Assessment Report
(PQAR) – Main document
for data set CDR 2 (2003-2017)



Satellite XCO₂ quality overview

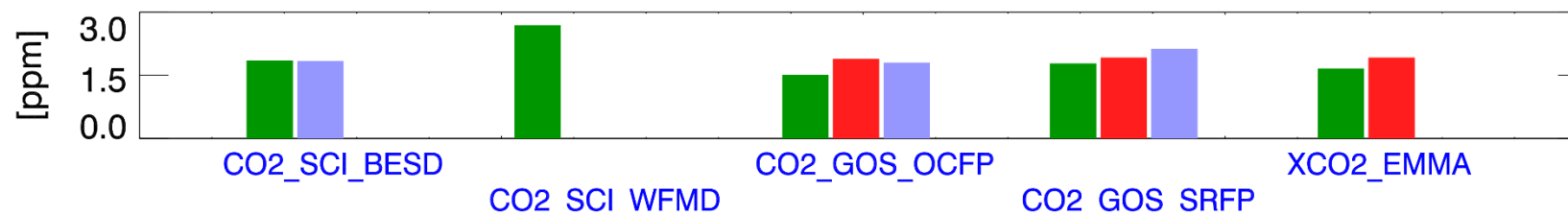
C3S Level 2 products: XCO₂

QA/QC method (applied to all products)

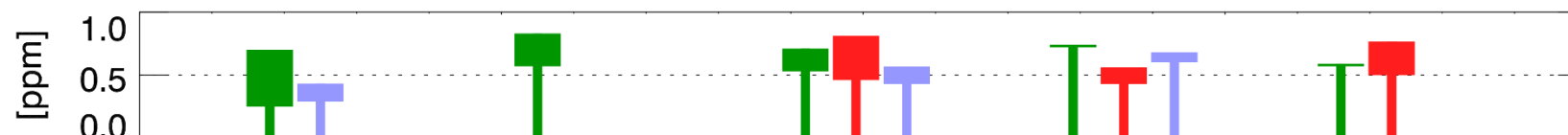
DP methods (applied by data provider)

EMMA method

Single measurement random error (precision, 1-sigma)

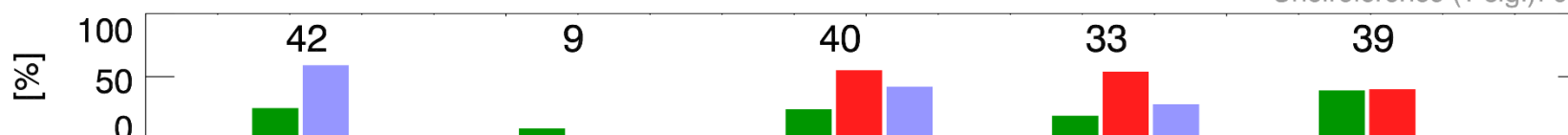


Accuracy (spatial/spatio-temporal bias range)

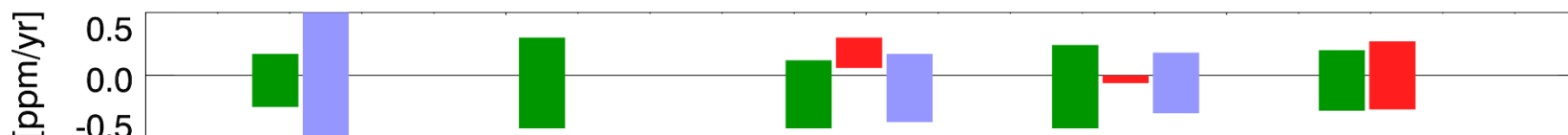


Accuracy: Probability that TR is met

Unc.reference (1-sig.): 0.4

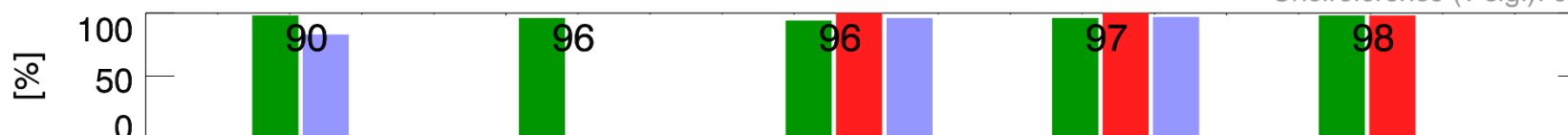


Stability (drift, +/- 3-sigma)



Stability: Probability that TR is met

Unc.reference (1-sig.): 0.2



Overall: **High stability of the satellite retrievals**
(no significant linear trend as scatter around zero due to slightly positive, zero or slightly negative trends depending on TCCON site)

Summary & conclusions

- Greenhouse gas (GHG) Essential Climate Variable (**ECV**) satellite-derived data product (CO₂ & CH₄) have been generated initially via the **GHG-CCI** project of ESA's Climate Change Initiative (CCI); since end of 2016 these products are generated operationally via the Copernicus Climate Change Service (**C3S**) and are made available via the Copernicus Climate Data Store (**CDS**)
- Near-real time products are generated via the Copernicus Atmosphere Monitoring Service (**CAMS**)
- The C3S XCO₂ & XCH₄ products are:
 - Individual sensor L2 products as generated with European retrieval algorithms
 - Merged L2 product via **EMMA** algorithm (includes also non-European (NIES, NASA) products)
 - Merged L3 product in **Obs4MIPs** format (monthly, 5°x5°)
 - Latest version: **v3.1** (2003-2017; **SCIAMACHY & GOSAT**)
- Ongoing:
 - R&D to add new sensors via **GHG-CCI+** project: OCO-2, TanSat, Sentinel-5-Precursor, GOSAT-2
 - Generation of v4 EMMA & Obs4MIPs products: 2003-**2018**, with **OCO-2**, ...
 - **Preliminary XCO₂ v4/beta results have been presented; v4 will be available in Q4/2019**
 - Publication planned (input data providers will be offered co-authorship)

Acknowledgements

Data sets:

- Satellite Level 1 input data:
 - **JAXA** (GOSAT)
 - **ESA** (GOSAT via Third Party Mission archive)
 - **ESA & DLR** (SCIAMACHY)
 - **NASA** (OCO-2)
- Satellite Level 2:
 - **NIES** (GOSAT)
 - **NASA** (GOSAT, OCO-2)
- Ground-based:
 - **TCCON** network
 - **NOAA** (CO₂ growth rates)
- Meteorology:
 - **ECMWF**
- Model / assimilation system:
 - **NOAA** (CarbonTracker)

Funding:

- **European Commission:**
 - **Copernicus** projects **C3S** (C3S_312b_Lot2 led by DLR) & **CAMS** (CAMS41 led by LSCE)
 - **H2020** projects **CHE & VERIFY** for supporting the development of the FOCAL OCO-2 XCO₂ retrieval algorithm
- **ESA** Climate Change Initiative (CCI) via projects **GHG-CCI** (2010-2017) & **GHG-CCI+** (since March 2018)

Research conducted under the framework of the GOSAT RA (PI project CONSCIGO)