



Co-ordinated by  
**ECMWF**



**CoCO2**

Prototype system for a  
Copernicus CO<sub>2</sub> service

# ESTIMATION OF TERRESTRIAL BIOGENIC CO<sub>2</sub> FLUXES FROM IFS MODEL INVERSIONS: FIRST RESULTS FROM THE COCO2 PROJECT AND FUTURE PROSPECTS FOR THE CAMS GLOBAL CO<sub>2</sub> EMISSION MONITORING SERVICE

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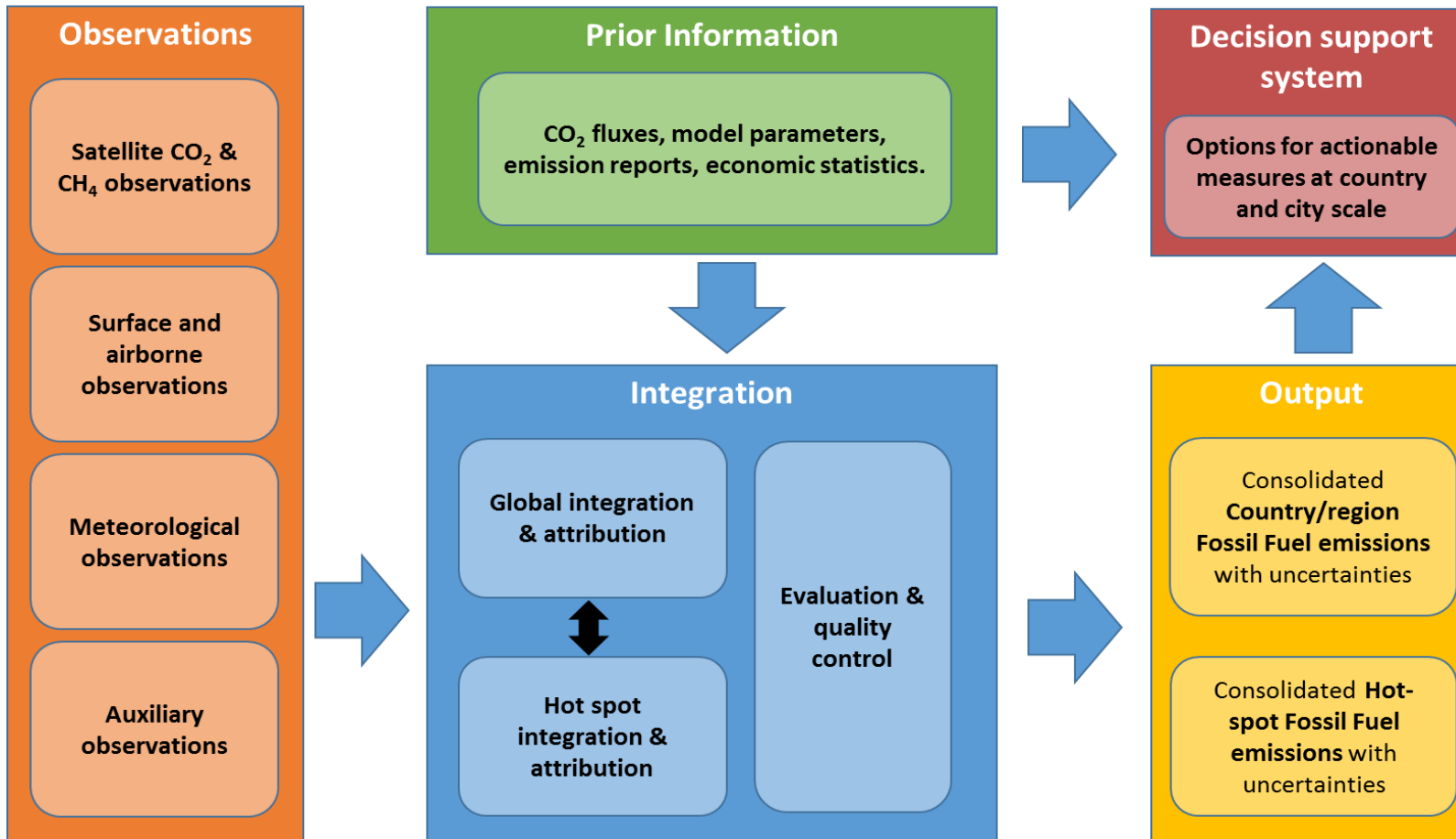
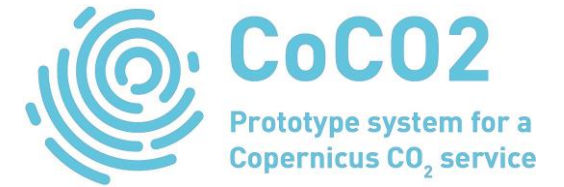
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- **Objectives of Copernicus Monitoring and Verification System (MVS)**
- **IFS global inversion system: the core of MVS**
- **Illustrations of some results of the system: CH<sub>4</sub> and CO<sub>2</sub>**



# Prototype Copernicus Monitoring and Verification System (MVS)

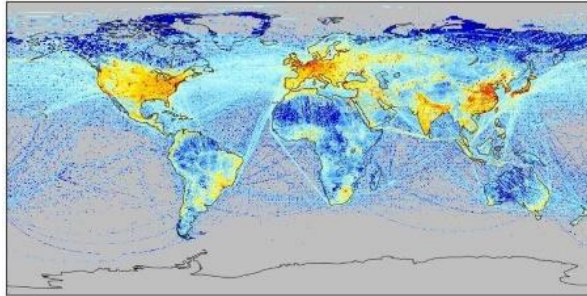




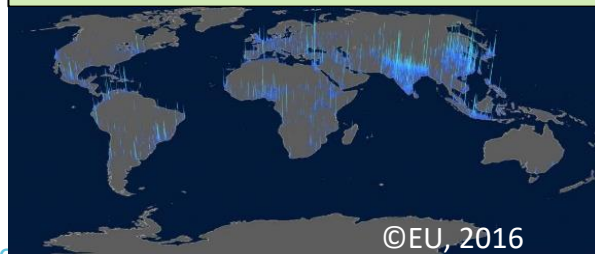
# The IFS global inversion system

## INPUT DATASETS

**EMISSION INVENTORIES  
WITH TEMPORAL/VERTICAL  
PROFILES & UNCERTAINTIES  
(JRC EDGAR, TNO/BSC, CAMS81)**



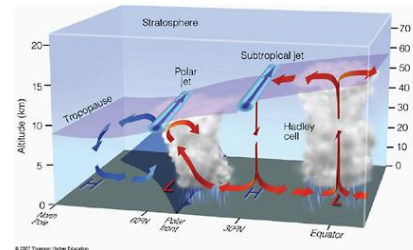
**VEGETATION & URBAN MAPS  
(ESA-CCI, JRC GHSL)  
OCEAN FLUXES (CMEMS)**



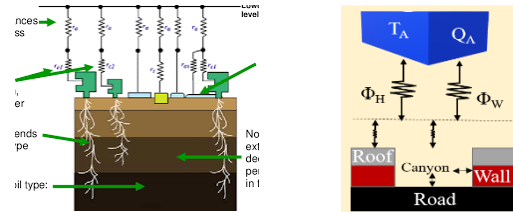
©EU, 2016

## IFS FORECAST MODEL & DATA ASSIMILATION

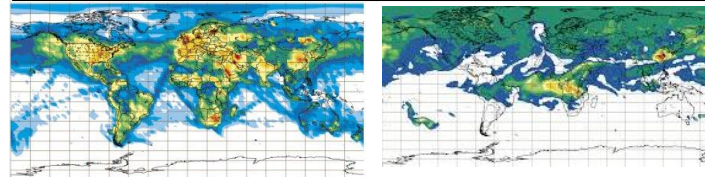
### IFS ATMOSPHERIC TRANSPORT



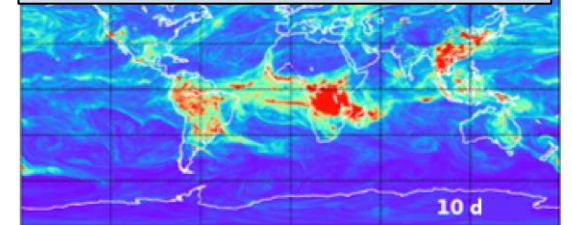
### URBAN & VEGETATION MODEL, LAND SURFACE DATA ASSIMILATION



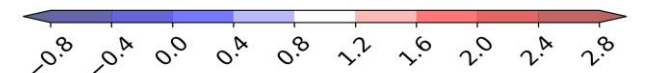
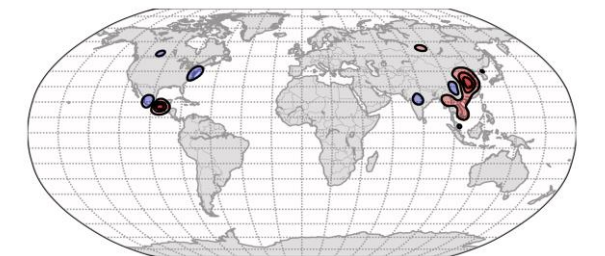
### CAMS REACTIVE SPECIES (NO<sub>x</sub>, CO, OH, CH<sub>4</sub>)



### ENSEMBLE APPROACH (uncertainty estimation & propagation)



### 4D-VAR ATMOSPHERIC ANALYSIS & INVERSION CAPABILITY





# IFS 4D-Variational inversion

$$J(\mathbf{x}, \mathbf{p}) = (\mathbf{x} - \mathbf{x}_b)^T \mathbf{B}_x^{-1} (\mathbf{x} - \mathbf{x}_b) + (\mathbf{p} - \mathbf{p}_b)^T \mathbf{B}_p^{-1} (\mathbf{p} - \mathbf{p}_b) + (\mathbf{y} - h(\mathbf{x}, \mathbf{p}))^T \mathbf{R}^{-1} (\mathbf{y} - h(\mathbf{x}, \mathbf{p}))$$

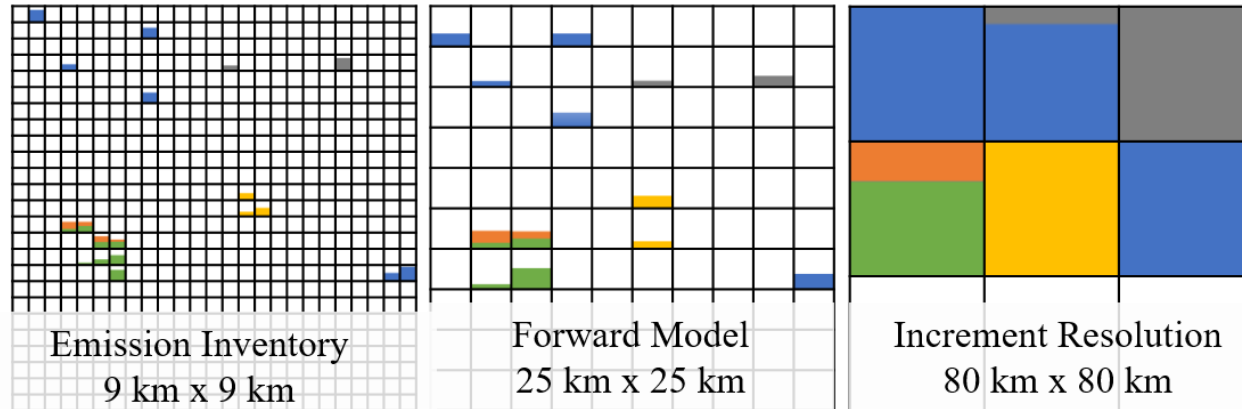
state (prognostic)

parameter (e.g., emission scaling factors)

Observations

## ➤ Characteristics of current system:

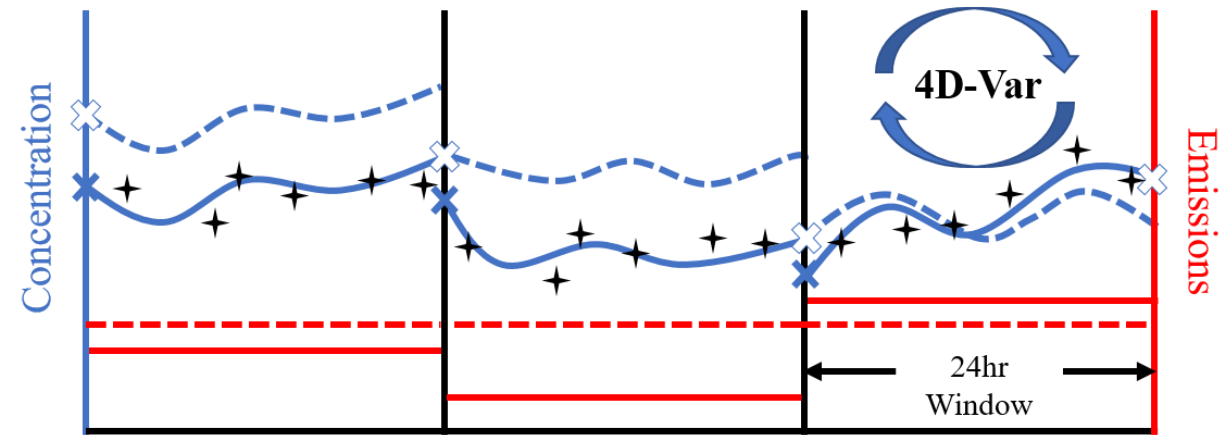
- Joint 3D state/fluxes 4D-Var optimisation
- 12-hour or 24-hour window
- Emissions: CO<sub>2</sub>, CH<sub>4</sub>, NO<sub>x</sub>, CO
- Biogenic CO<sub>2</sub> fluxes (GPP and respiration)
- Observations: OMI NO<sub>2</sub>; TROPOMI NO<sub>2</sub>, CO, CH<sub>4</sub>; IASI CH<sub>4</sub>, CO<sub>2</sub>; GOSAT CO<sub>2</sub>, CH<sub>4</sub>; OCO-2 & OCO-3 CO<sub>2</sub>
- **B** model: spatial error correlation, cross-species correlations



■ Energy   
 ■ Agriculture   
 ■ Waste   
 ■ Other   
 ■ Wetlands

## Case of CH<sub>4</sub> emission categories

CoCO<sub>2</sub> – Prototype system for a Copernicus CO<sub>2</sub> service

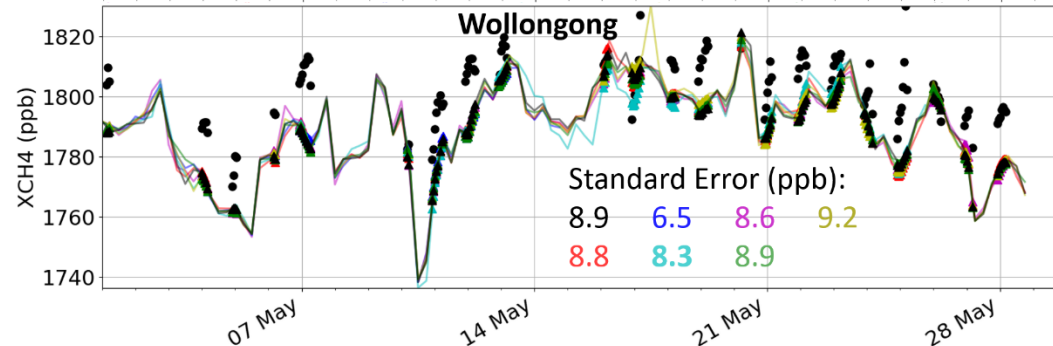
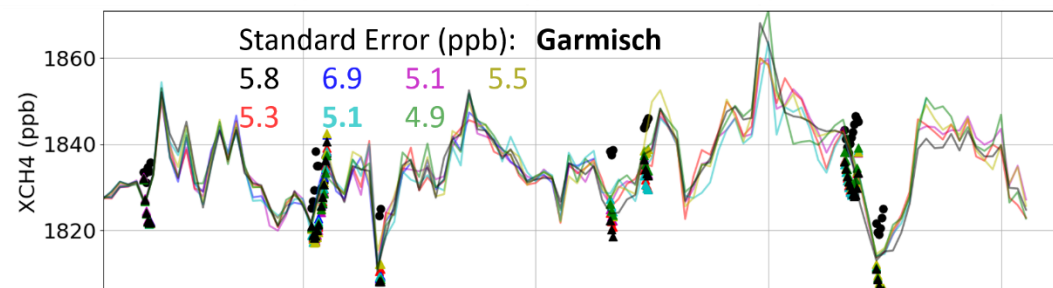
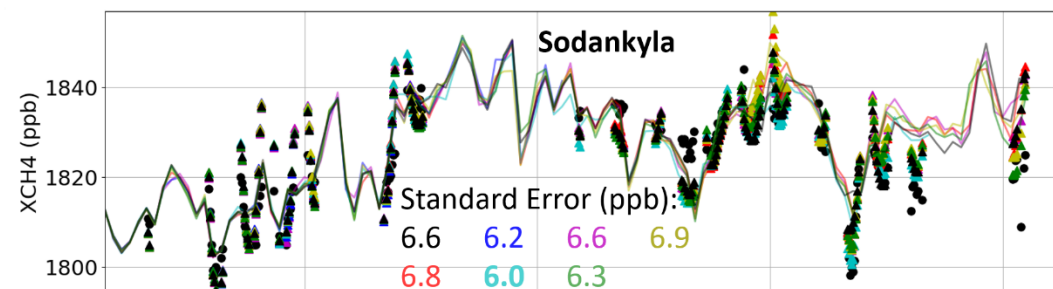
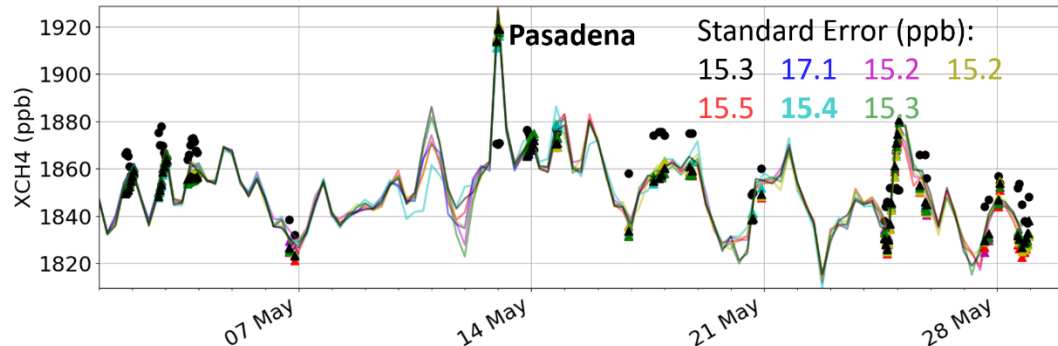
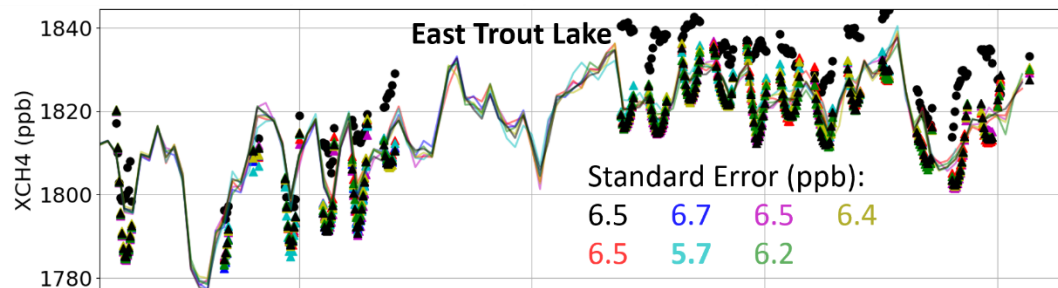
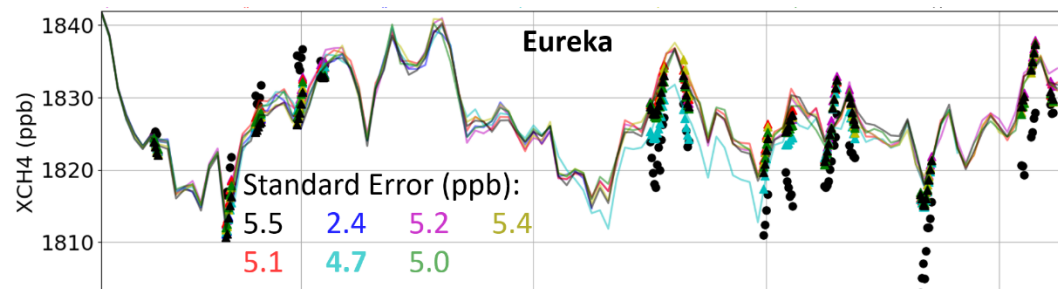


⊗ Prior Initial 3D State   
 --- Prior Concentration   
 --- Prior Emissions  
⊗ Posterior Initial 3D State   
 — Posterior Concentration   
 — Posterior Emissions   
 ✦ Observations



# Inversion of CH<sub>4</sub> emissions: Validation of the optimized CH<sub>4</sub> concentrations

Results show that inversion (colours) captures quite well the TCCON XCH<sub>4</sub> variations (black dotted)

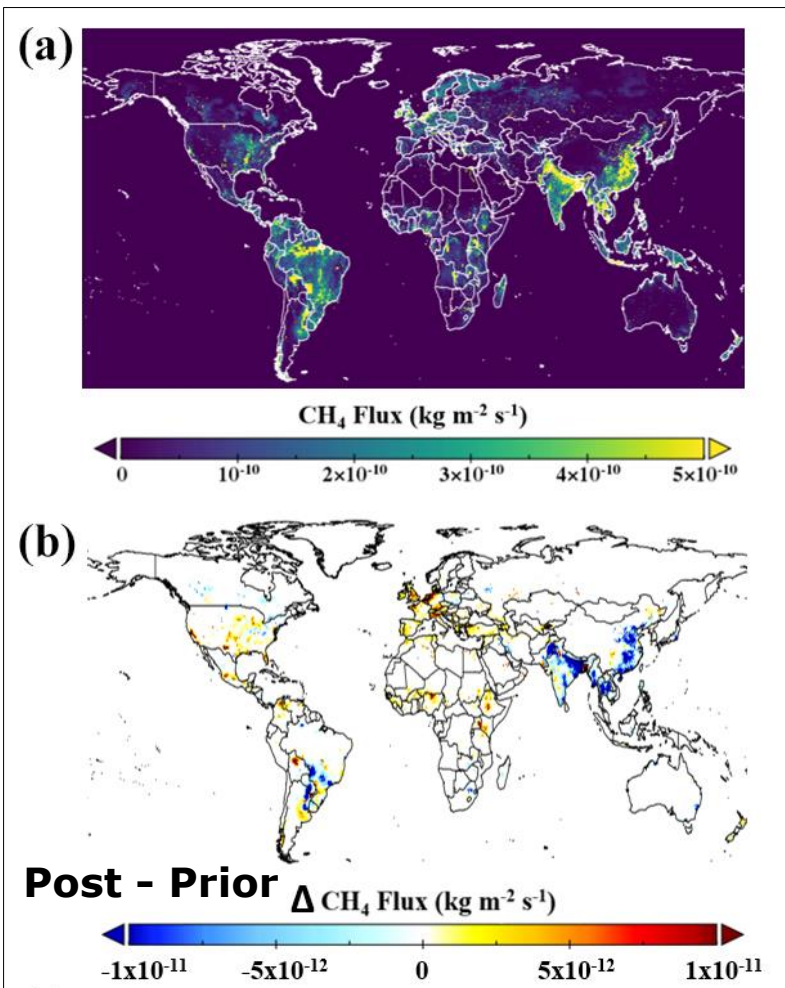


2019

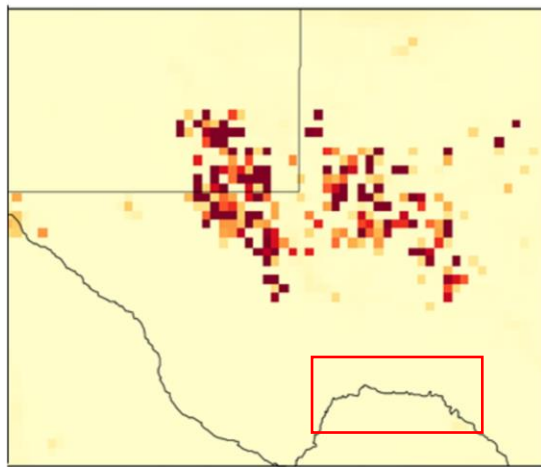


# Inversion of CH<sub>4</sub> emissions

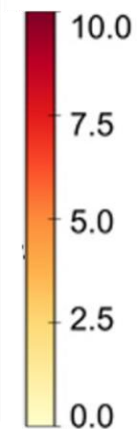
## Case from oil & gas fields over USA



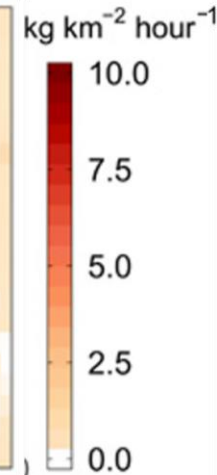
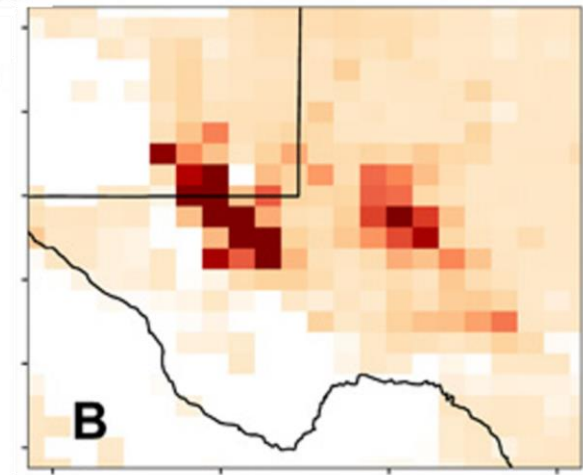
IFS Posterior – 2.5 Tg a<sup>-1</sup>  
(Prior – 1.9 Tg a<sup>-1</sup>)



kg km<sup>-2</sup> hour<sup>-1</sup>



Zhang et al. Posterior – 2.9 Tg a<sup>-1</sup>



Context : The Permian Basin, largest oil & gas field in USA, operations rapidly increased in the past decade, this may be missing in inventories. Assimilated TROPOMI & GOSAT XCH<sub>4</sub> for 03/01/19

This study: (McNorton et al., 2022)

Zhang et al., 2020

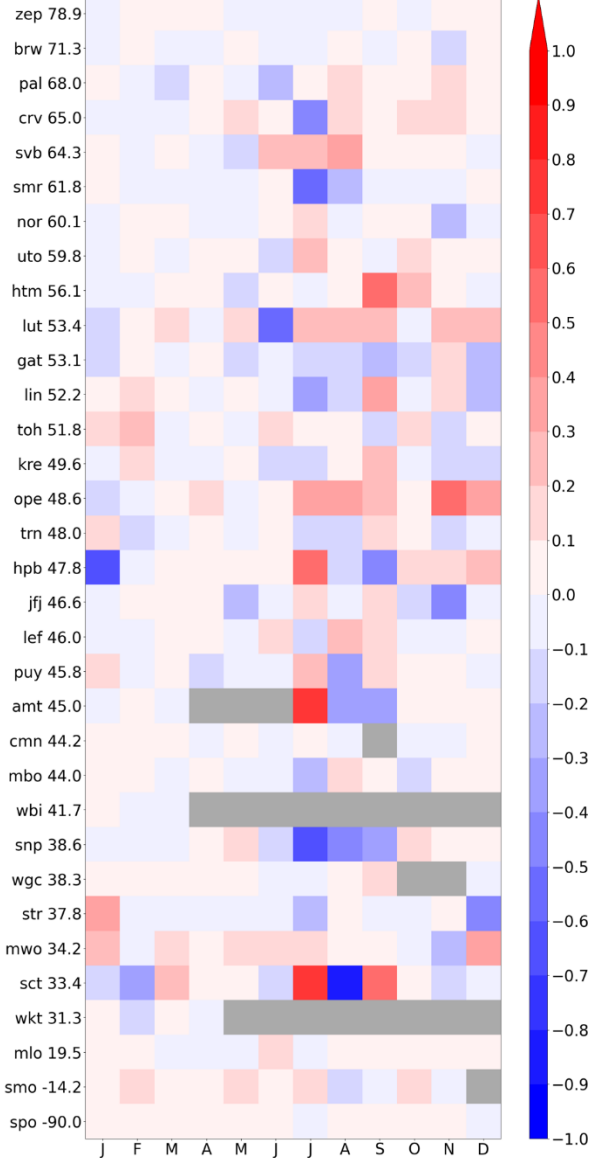
- IFS 4D-Var inversion
- TROPOMI, GOSAT, IASI observations

- GEOS-CHEM 0.5°
- TROPOMI observations

- IFS inversions are in good agreement with Zhang et al., 2020
- Both studies estimate higher emissions compared to prior

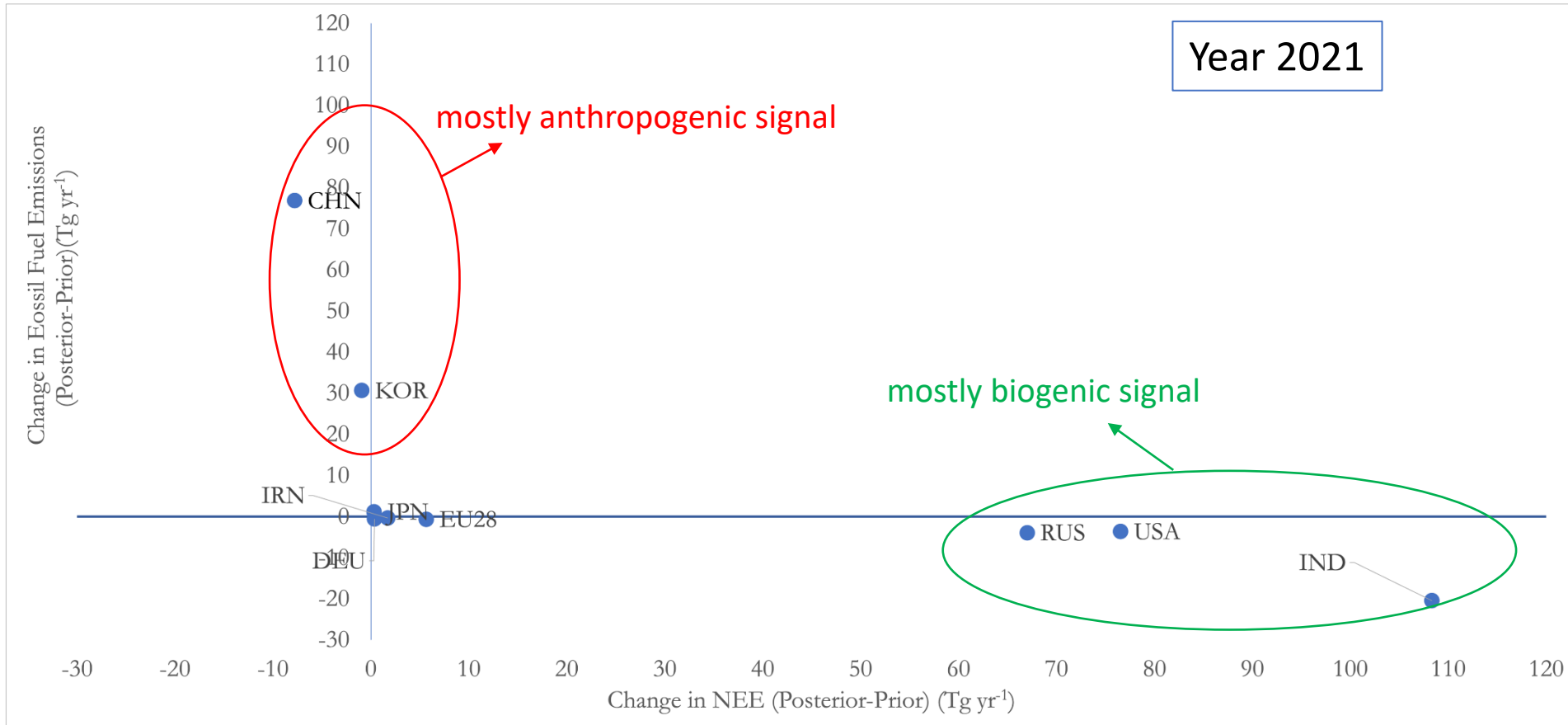
# Preliminary results with CO<sub>2</sub> inversion

RMSE diff (inversion-ctrl) (ppm)



In situ comparison

Obspack co2\_1\_NRT\_v6.1.1\_2021-05-17

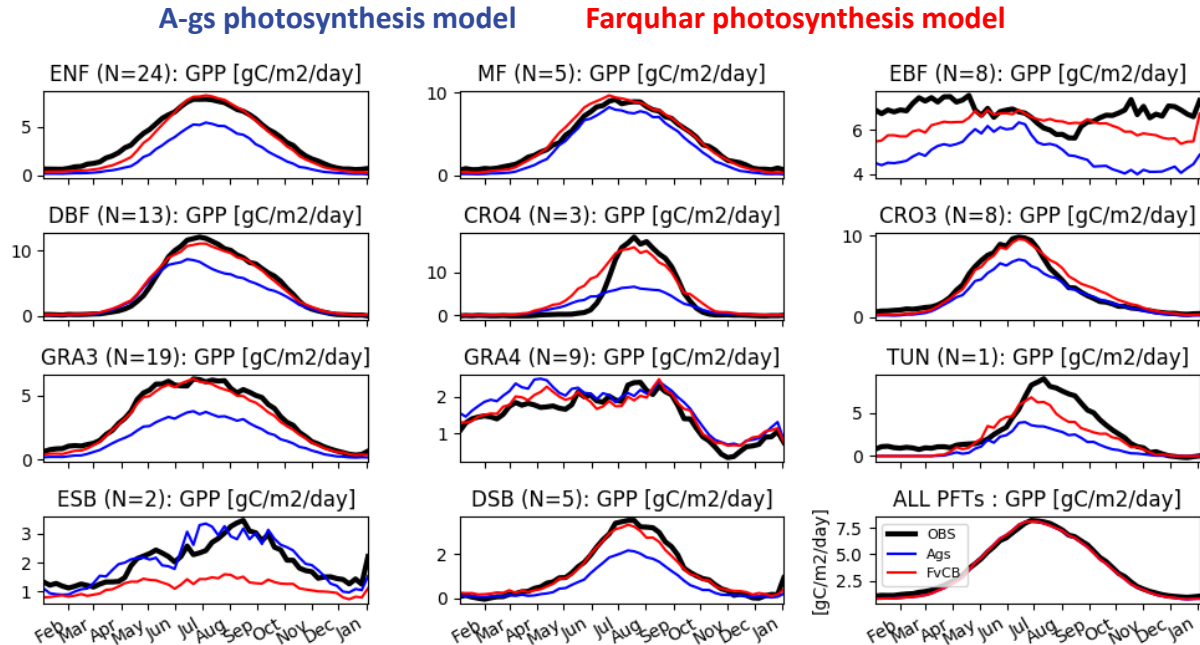


- In situ evaluation: averaged impact neutral but significant spatial variations
- Results show geographically contrasted observational constraints on fossil fuel and biogenic fluxes
- Need to include additional observational constraints from co-emitters such as NO<sub>2</sub> to disentangle the biogenic from the anthropogenic signal and improve posterior estimates

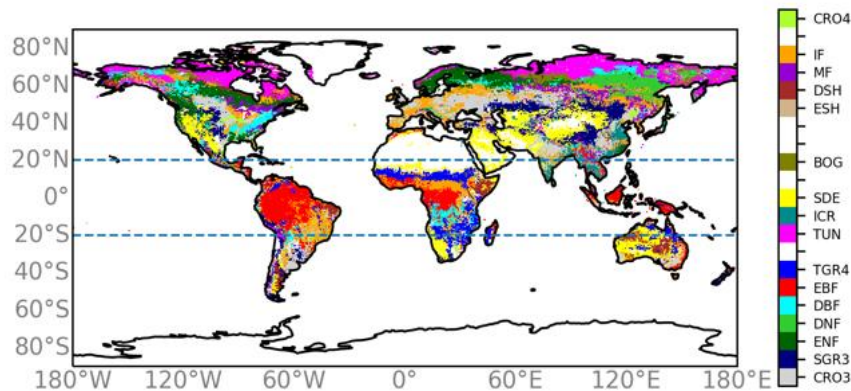
service

# Modelling GPP : New photosynthesis model and LAI climatology

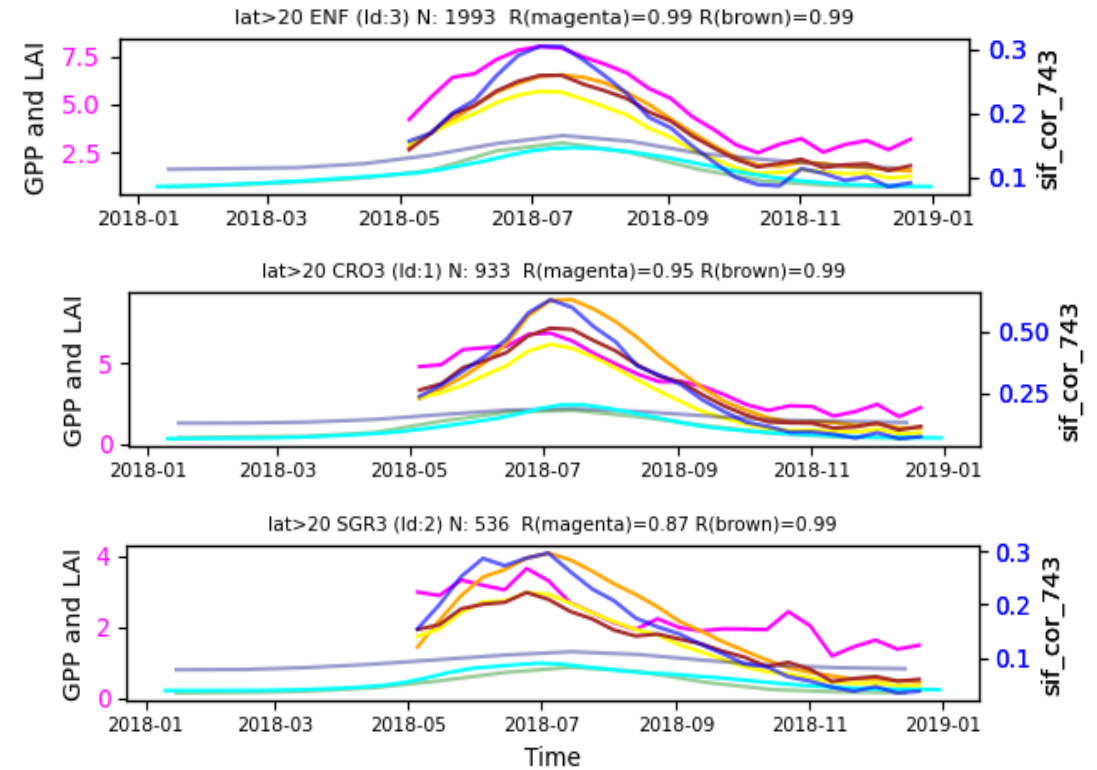
Evaluation with FLUXNET2015 eddy covariance observations [Pastorello et al., 2020]



Model dominant PFTs



Evaluation with SIF and GPP satellite-based products



Model GPP with OPERATIONAL MODIS LAI climatology

Model GPP with NEW CGLS LAI climatology

FLUXCOM GPP (Jung et al., 2020)

FLUXSAT GPP (Joiner et al., 2018, Joiner and Yoshida, 2020)

TROPOSIF SIF (Guanter et al., 2021)

clim LAI\_op. (Boussetta et al. 2015)

clim LAI\_new based on Copernicus LAI

2018 LAI\_new





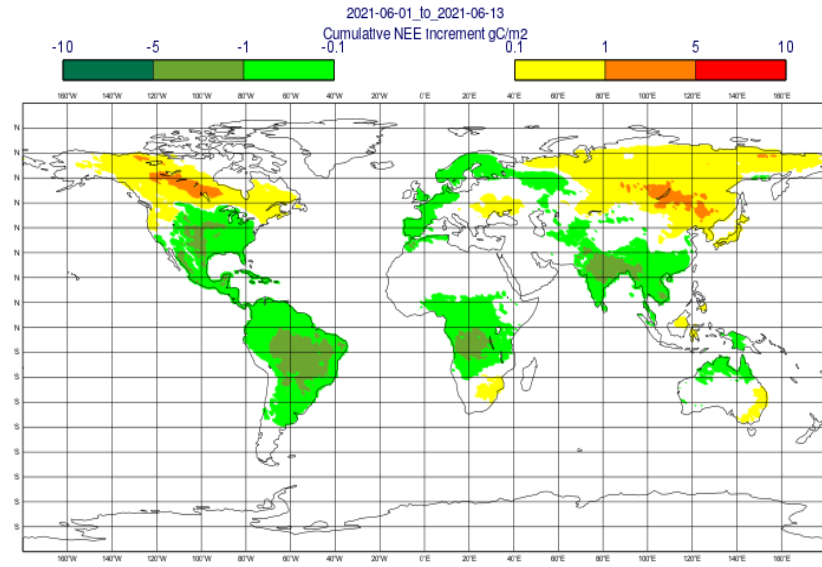
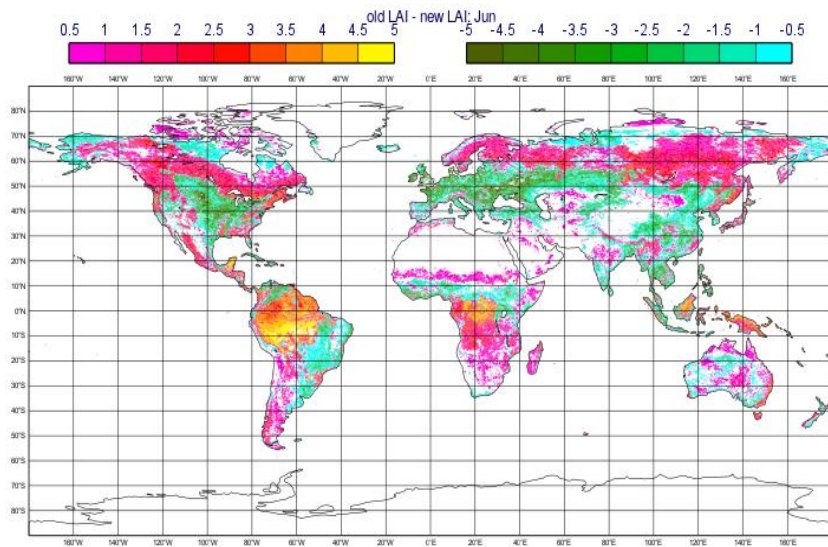
# NEE increments from IFS inversion correct for large-scale systematic error in LAI

LAI is too high

LAI is too low

Sink is increased

Sink is reduced



LAI is too high

->

Reduction in sink

LAI is too low

->

Increase in sink



## Summary and perspectives

- Encouraging results obtained for CH<sub>4</sub> emission quantification, evaluation of CO<sub>2</sub> inversion in progress
- Capability of the IFS inversion to capture regional point source CH<sub>4</sub> emissions
  - Preliminary CO<sub>2</sub> inversion results show that NEE correction is able to partly compensate for the large systematic errors in the IFS LAI climatology
- Ongoing developments to implement a multi-species IFS global inversion system, to be integrated in a multi-scale, multi-system operational CO<sub>2</sub> MVS (future Copernicus service)
- CO<sub>2</sub>M mission will provide operational retrievals of tropospheric CO<sub>2</sub>, CH<sub>4</sub> and NO<sub>2</sub> columns → unique opportunity to constrain anthropogenic emissions
  - Link between anthropogenic CO<sub>2</sub> emissions and co-emitters (NO<sub>2</sub>, CO) needs to be further characterised → upcoming HORIZON 2022 CORSO project
  - Better use of the GHG observational constraints in the global IFS inversion system requires to implement a long-window 4D-Var → a new hybrid ensemble-variational system is under development that will allow to extend the assimilation window to several weeks



## More detailed questions, you can contact:

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