



T.B.D.

Wouter Peters

*Anne-Wil van den Berg, Auke van der
Woude, Joram Hooghiem, Ingrid Luijkx,
Remco de Kok, Kim Faassen, Maarten
Krol, Firmin Stroo, Marnix van de Sande,
Liesbeth Florentie, Gerbrand Koren*





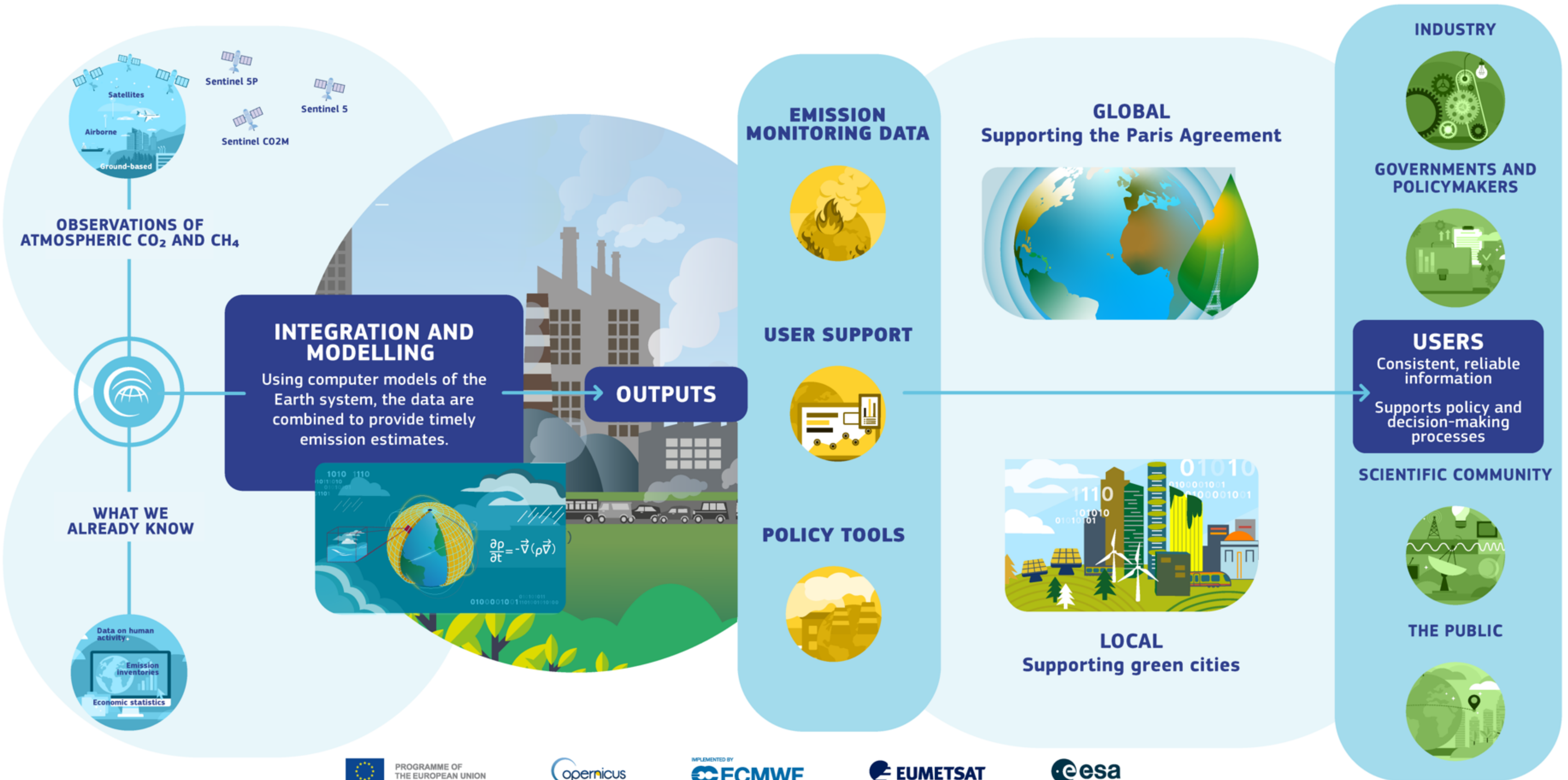
Carbon cycle data assimilation in support of the Copernicus Monitoring and Verification System: ~~towards~~ multi-tracer and multi-scale CarbonTracker

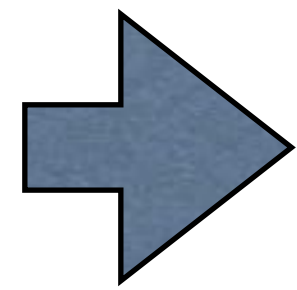
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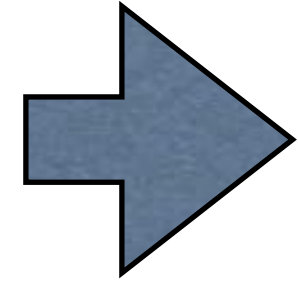


Greenhouse gas emissions monitoring capacity

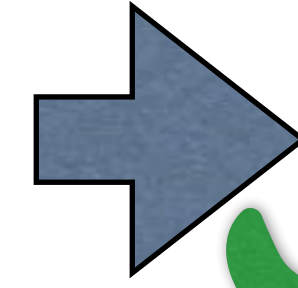




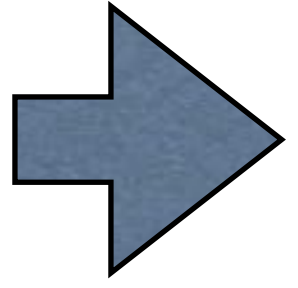
CO₂ Human Emissions



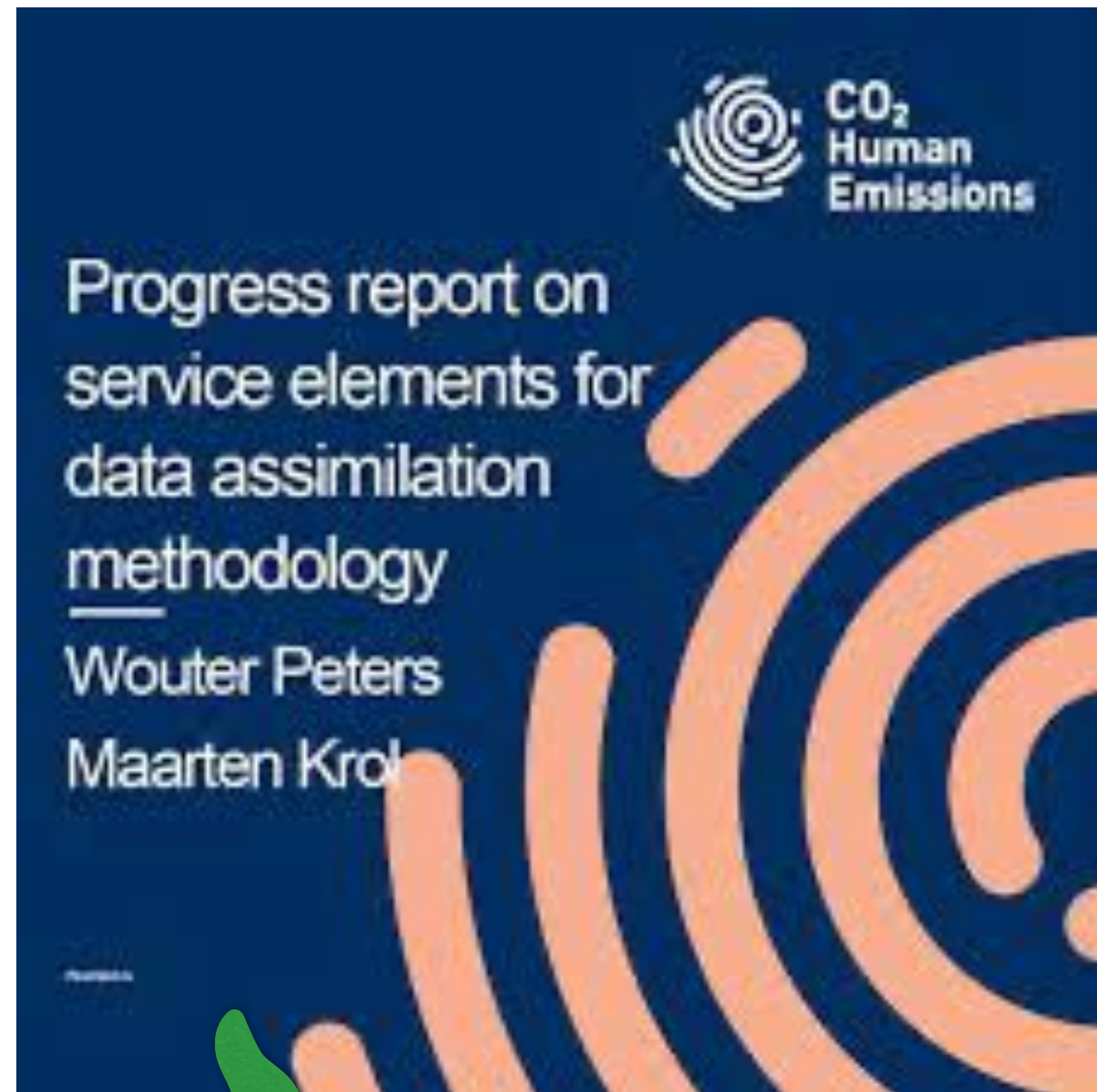
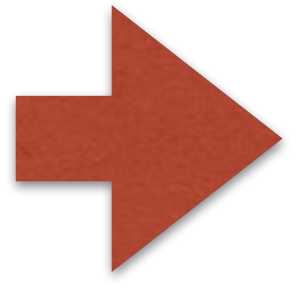
CoC02
Prototype system for a Copernicus CO₂ service



CORSO
Prototype system for a Copernicus CO₂ service



PARIS
EU verification support system

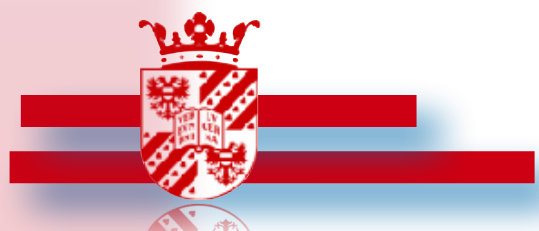


The CO₂ Human Emissions (CHE) Project: First Steps Towards a European Operational Capacity to Monitor Anthropogenic CO₂ Emissions

Gianpaolo Balsamo^{1*}, Richard Engelen¹, Daniel Thiemert¹, Anna Agusti-Panareda¹, Nicolas Bousseret¹, Grégoire Broquet², Dominik Brunner³, Michael Buchwitz⁴, Frédéric Chevallier², Margarita Choulga¹, Hugo Denier Van Der Gon⁵, Liesbeth Florentie⁶, Jean-Mathieu Haussaire², Greet Janssens-Maenhout⁷, Matthew W. Jones⁸, Thomas Kaminski⁹, Maarten Krol¹⁰, Corinne Le Quéré⁸, Julia Marshall¹¹, Joe McNorton¹, Pascal Prunet¹², Maximilian Reuter⁴, Wouter Peters¹⁰ and Marko Scholze¹³

OPEN ACCESS

Edited by:
Jochen Landgraf,

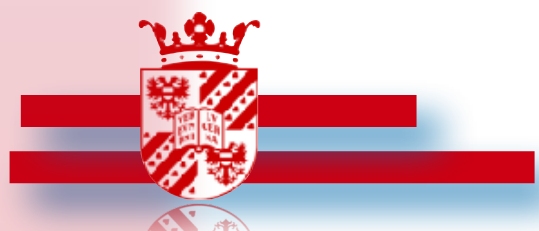




CarbonTracker Europe

- Data Assimilation system for atmospheric CO₂ mole fraction observations
- Runs on a weekly time-step, optimizes ocean+terrestrial biosphere carbon exchange over 20+ years (1040+ cycles)
- 9805+30 scaling factors (λ) estimated each week (d.o.f. \sim 750/week)
- λ multiplies the fluxes calculated with SIB4 and with the Jena ocean inversion product (so-called flux priors)

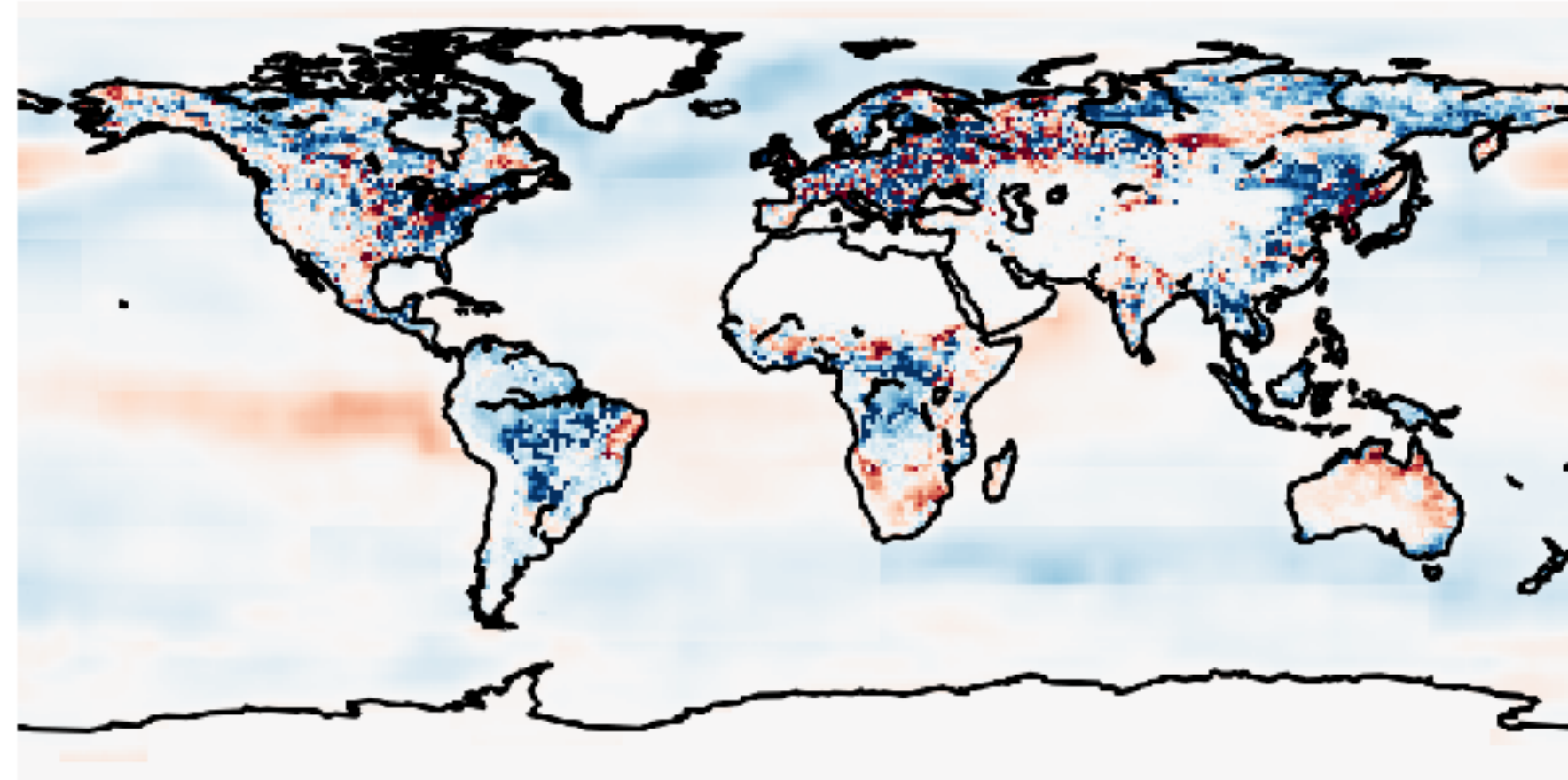
$$F_{\text{optimized}} = \lambda \cdot F_{\text{SIB4}} + \lambda \cdot F_{\text{ocean}} + F_{\text{fossil}} + F_{\text{fire}}$$





CarbonTracker Europe

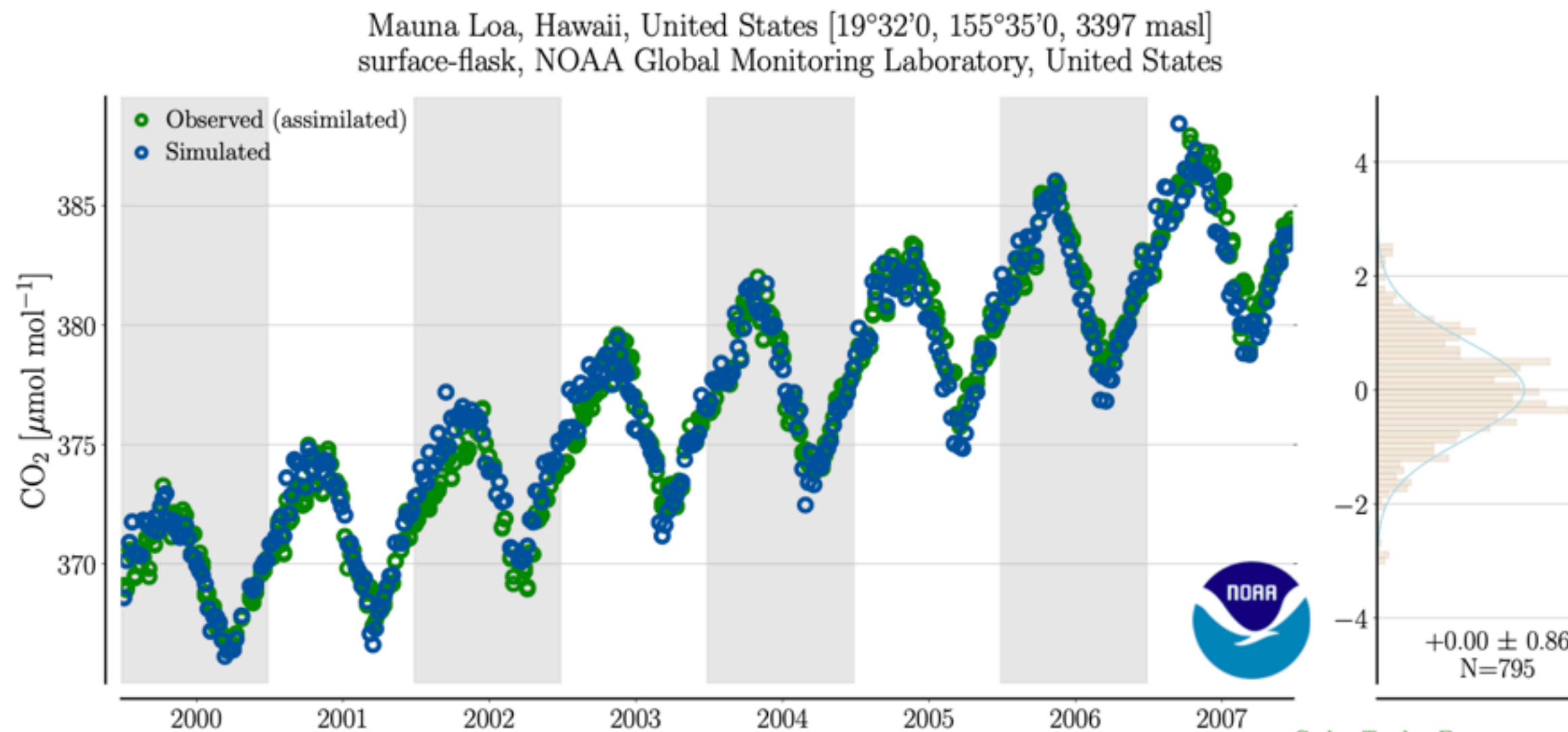
$$F_{\text{optimized}} = 9835 \cdot F_{\text{prior}}$$



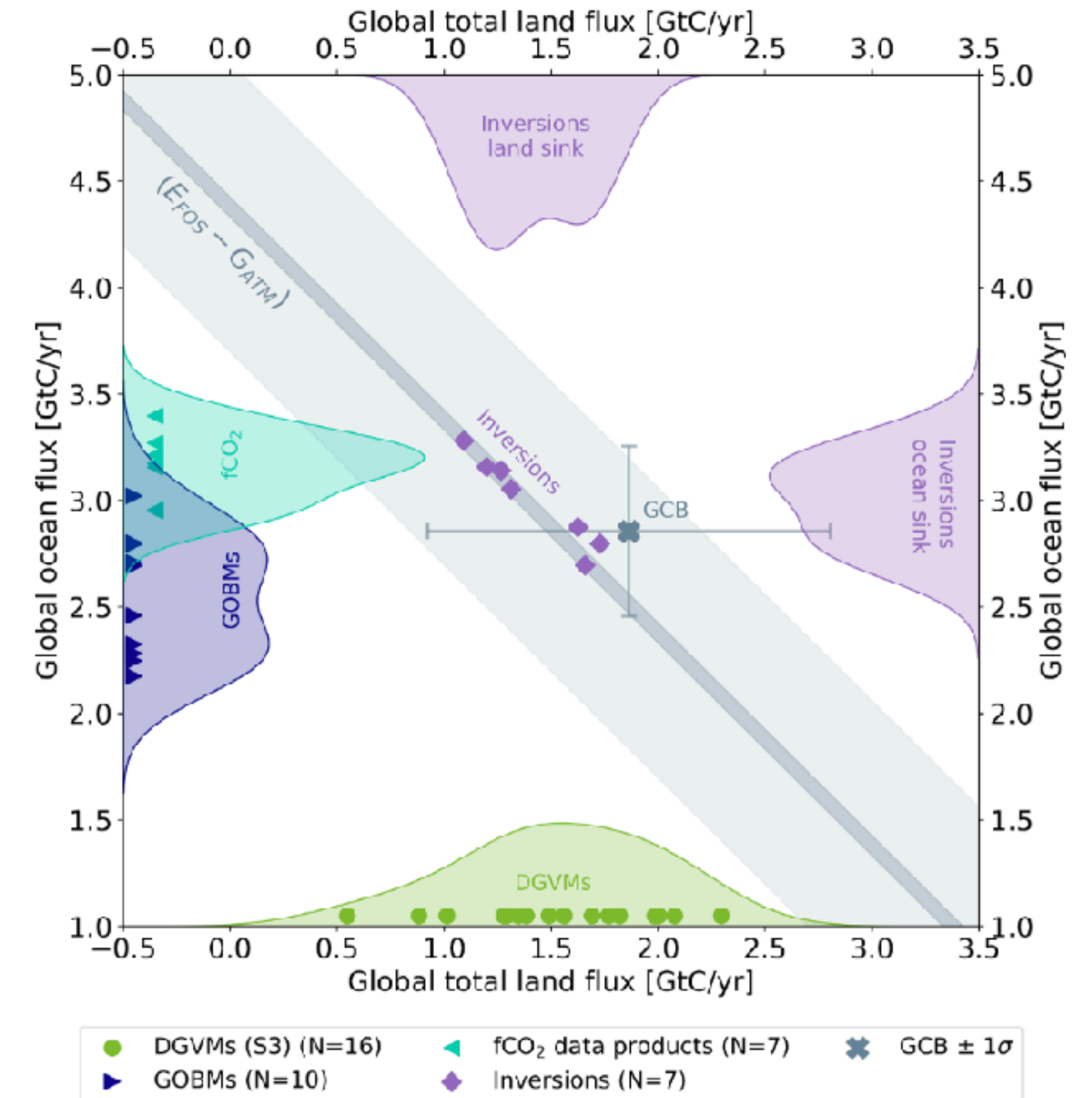
September 2020

Global Carbon Budget 2022

Pierre Friedlingstein^{1,2}, Michael O'Sullivan¹, Matthew W. Jones³, Robbie M. Andrew⁴, Luke Gregor⁵, Judith Hauck⁶, Corinne Le Quéré³, Ingrid T. Luijkx⁷, Are Olsen^{8,9}, Glen P. Peters⁴, Wouter Peters^{7,10}, Julia Pongratz^{11,12}, Clemens Schwingshackl¹¹, Stephen Sitch¹, Josep G. Canadell¹³, Philippe Ciais¹⁴,



CarbonTracker Europe
© Wageningen University





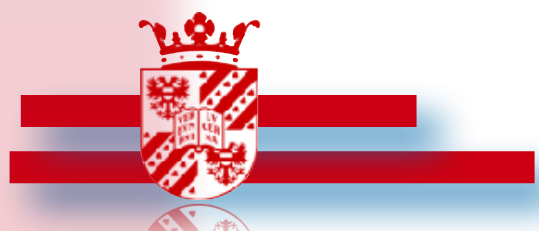
Two branches of new development

- **Multi-tracer**

- additional observations from $\delta^{13}\text{C}$, CO, O₂, $\Delta^{14}\text{C}$ can provide extra constraints on global C-cycling
- Some of these are moreover observed at space with high-resolution (MOPITT, TropOMI, OCO-2, CO₂-M)

- **Multi-scale**

- individual actors, sectors, or cities can be monitored locally, using high resolution (plume) models, and by resolving turbulent-to-diurnal and synoptic time+space scales (*talk by Auke van der Woude*)
- climate feedbacks (on Amazon tropical forest, or Arctic tundra, or Southern Ocean) require synoptic to decadal time+space scales





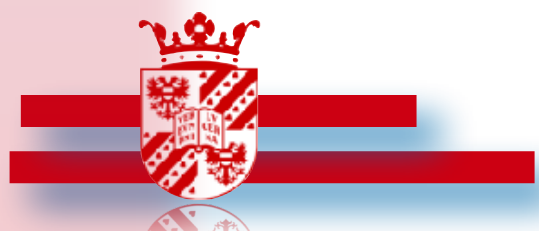
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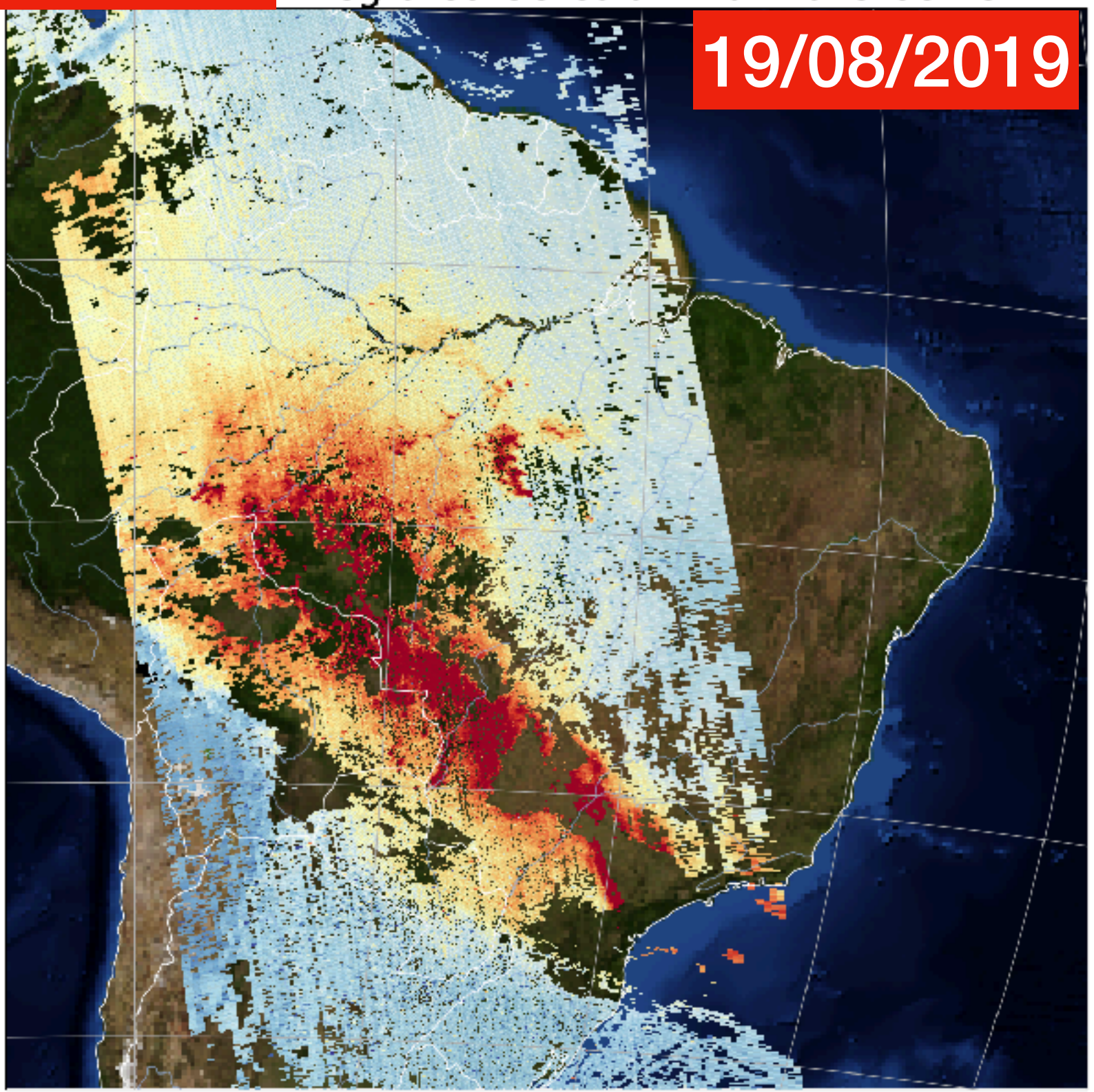
CoCO2 data assimilation (Anne-Wil)

Case 1: Deforestation emissions in Amazonia



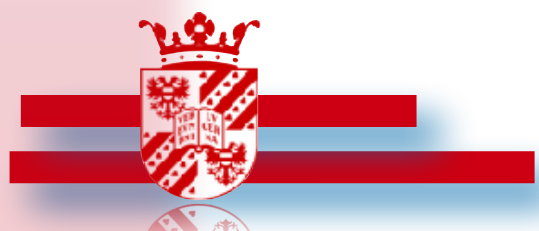
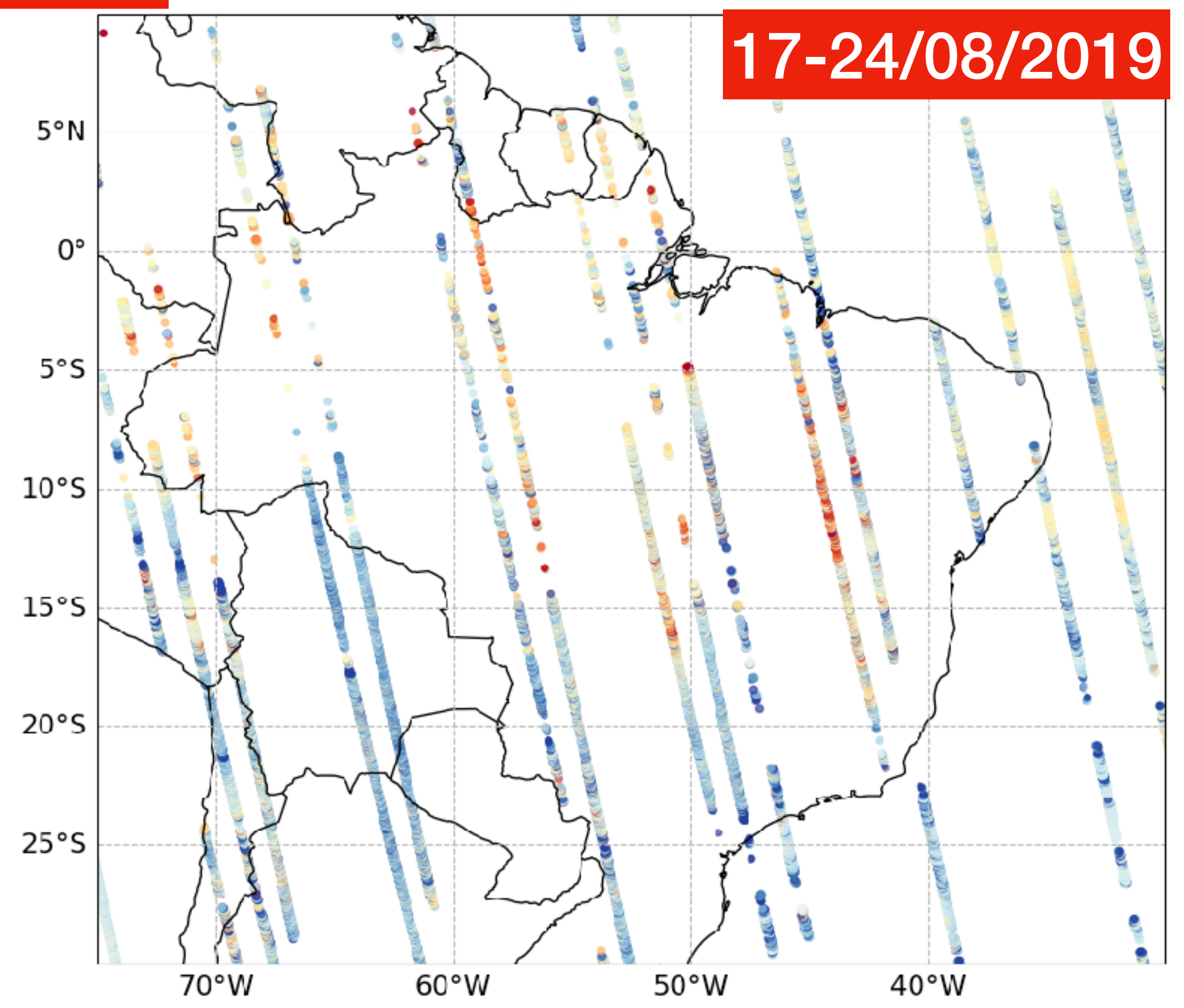
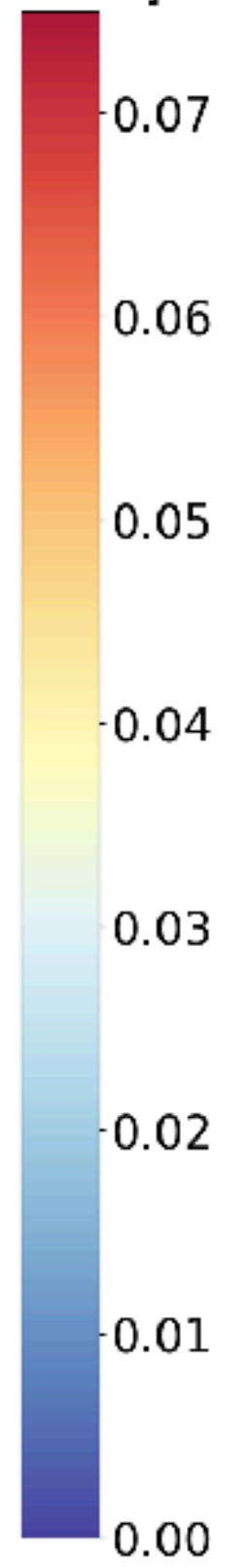
TropOMI S5P

integrated CO column at 2019-08-19



OCO-2

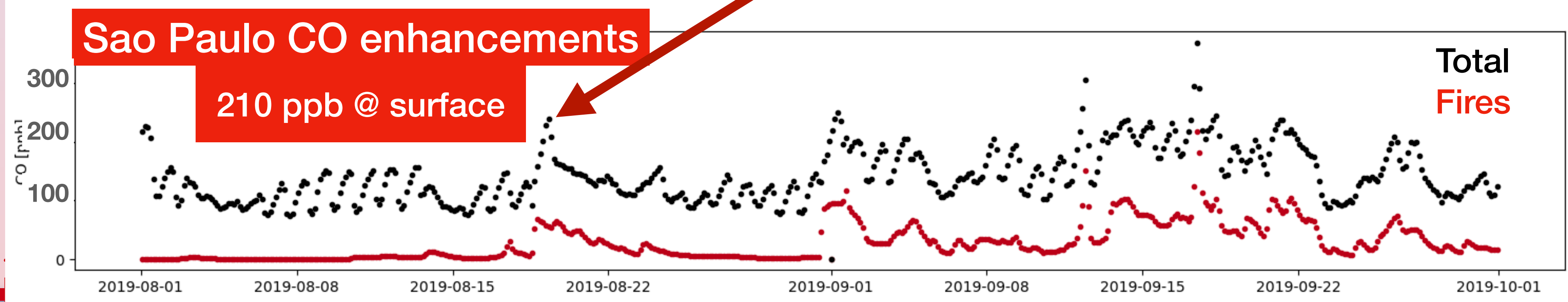
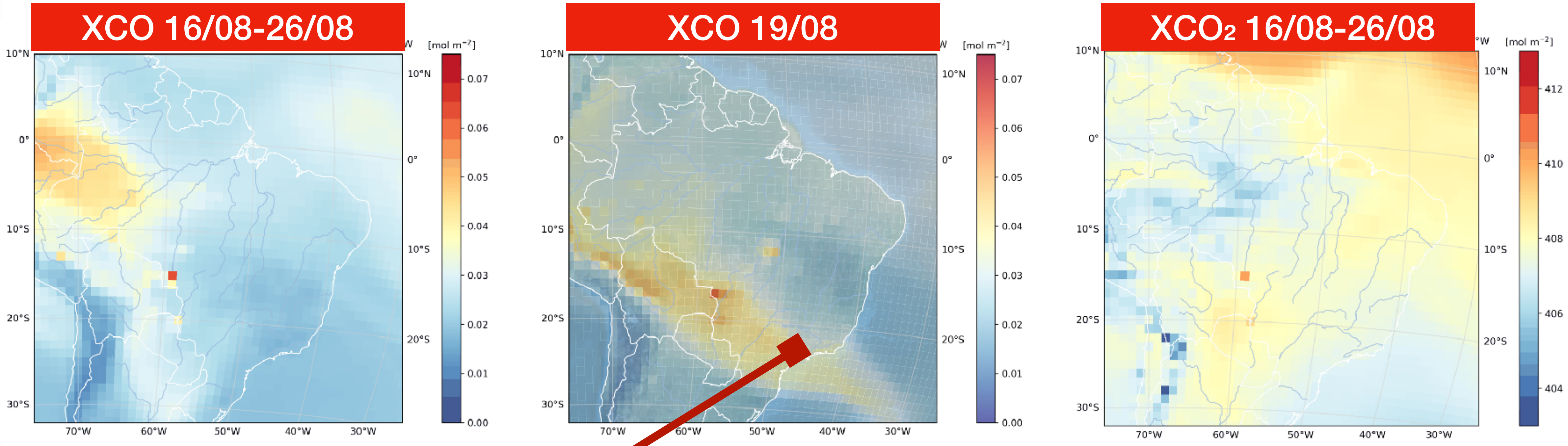
[mol m²]





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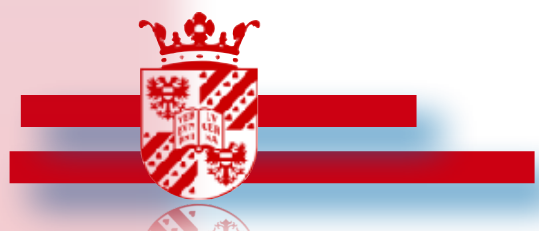
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CarbonTracker

1/1/2000

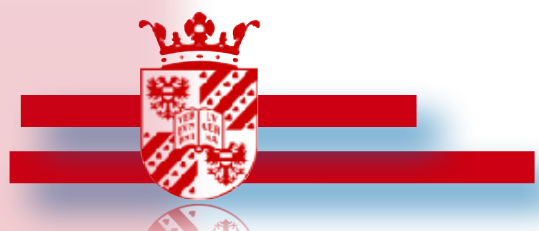


1/1/2020

cycle 1

cycle 1040

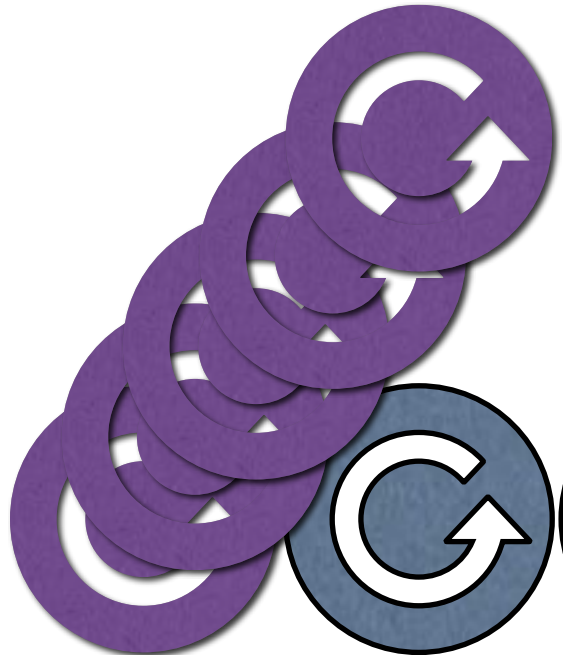
$$\lambda = 9835 * 1040 = 1 \times 10^7$$
$$TM5 = 52 * 20 * 6 = 6240 \text{ weeks}$$





CarbonTracker

1/1/2000



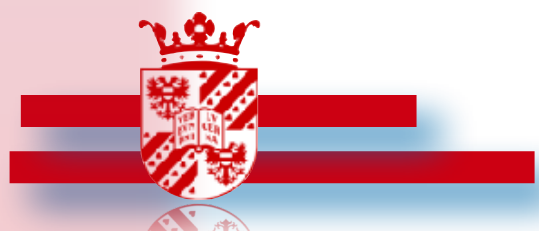
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1/1/2020

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CarbonTracker long-window



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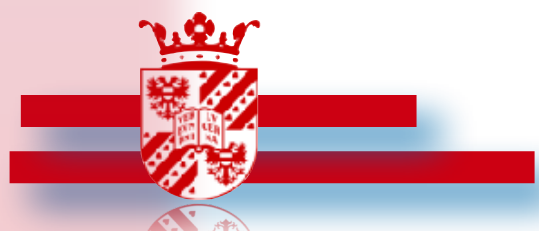
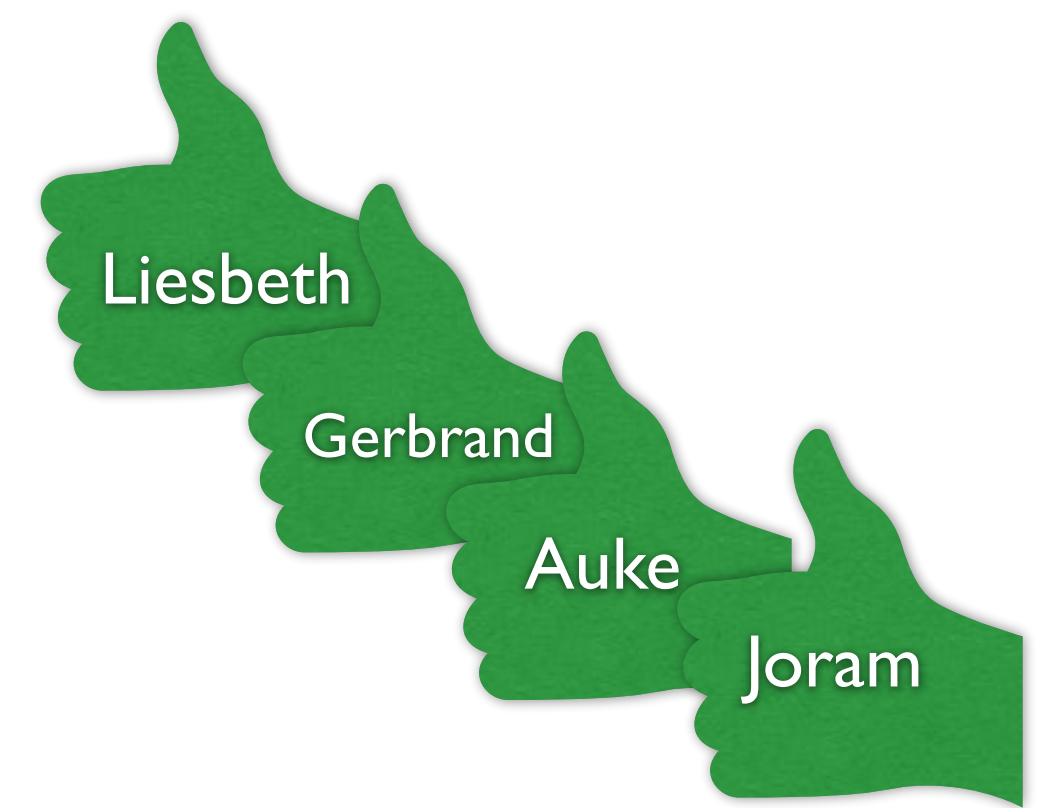
$$TM5 = 52 * 20 * 6 = 6240 \text{ weeks}$$



1 cycle

$$\lambda = 9835 * (365 + 365 + 365) = 1 \times 10^7$$

$$TM5 = 52 * 20 = 1040 \text{ weeks}$$

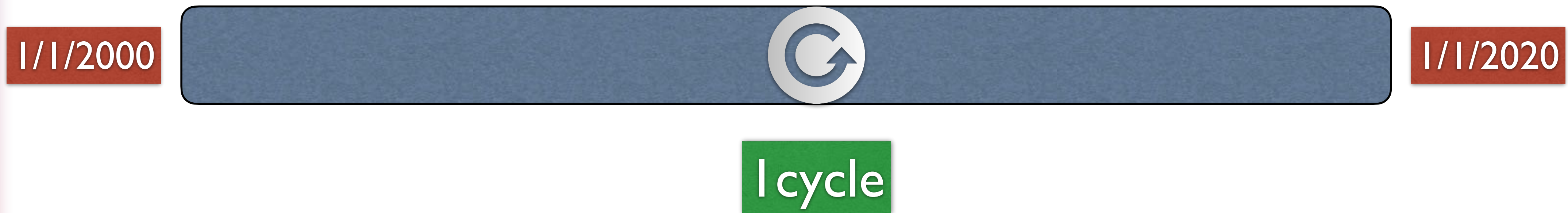




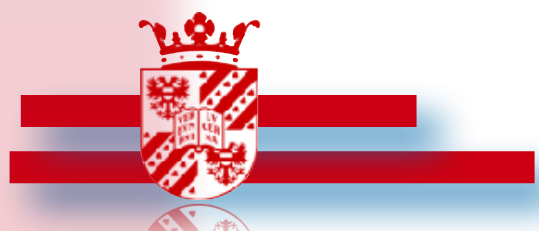
CarbonTracker long-window



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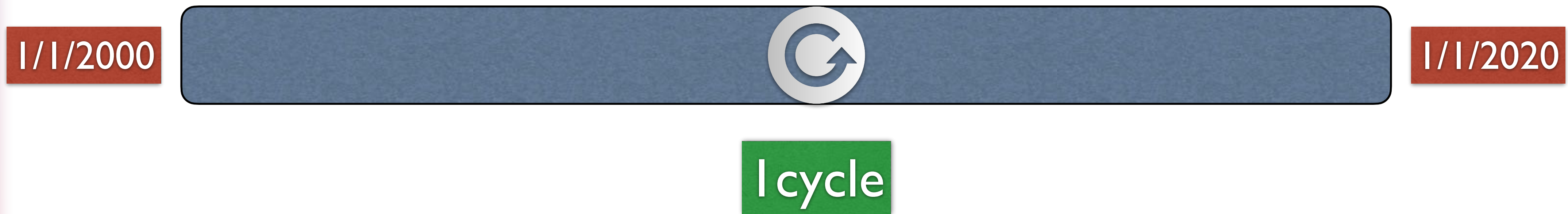


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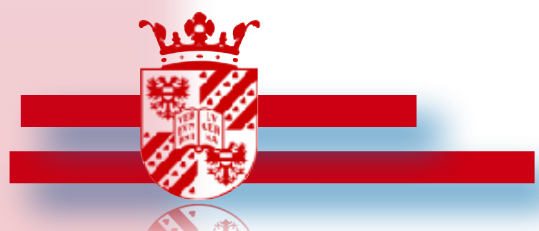
$$TM5 = 52 * 20 * 6 = 6240 \text{ weeks}$$



$$\lambda = 9835 * (365+365+365) = 1 \times 10^7$$

$$TM5 = 52 * 20 = 1040 \text{ weeks}$$

one-shot inversion resembles closely the 4dVAR approach!





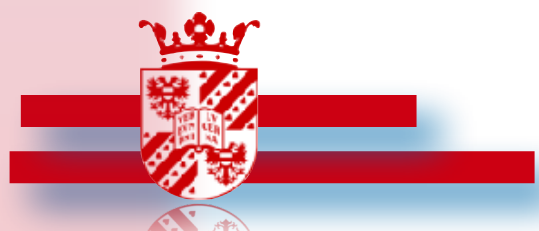
CarbonTracker long-window

$$F_{\text{optimized}} = (\lambda \cdot TER_{\text{prior}} + GPP_{\text{prior}}) + \lambda \cdot F_{\text{ocean}} + \Delta F + \gamma \cdot \Delta P$$

$\lambda = 365^*$ scaling factors to adjust the **long-term mean** flux

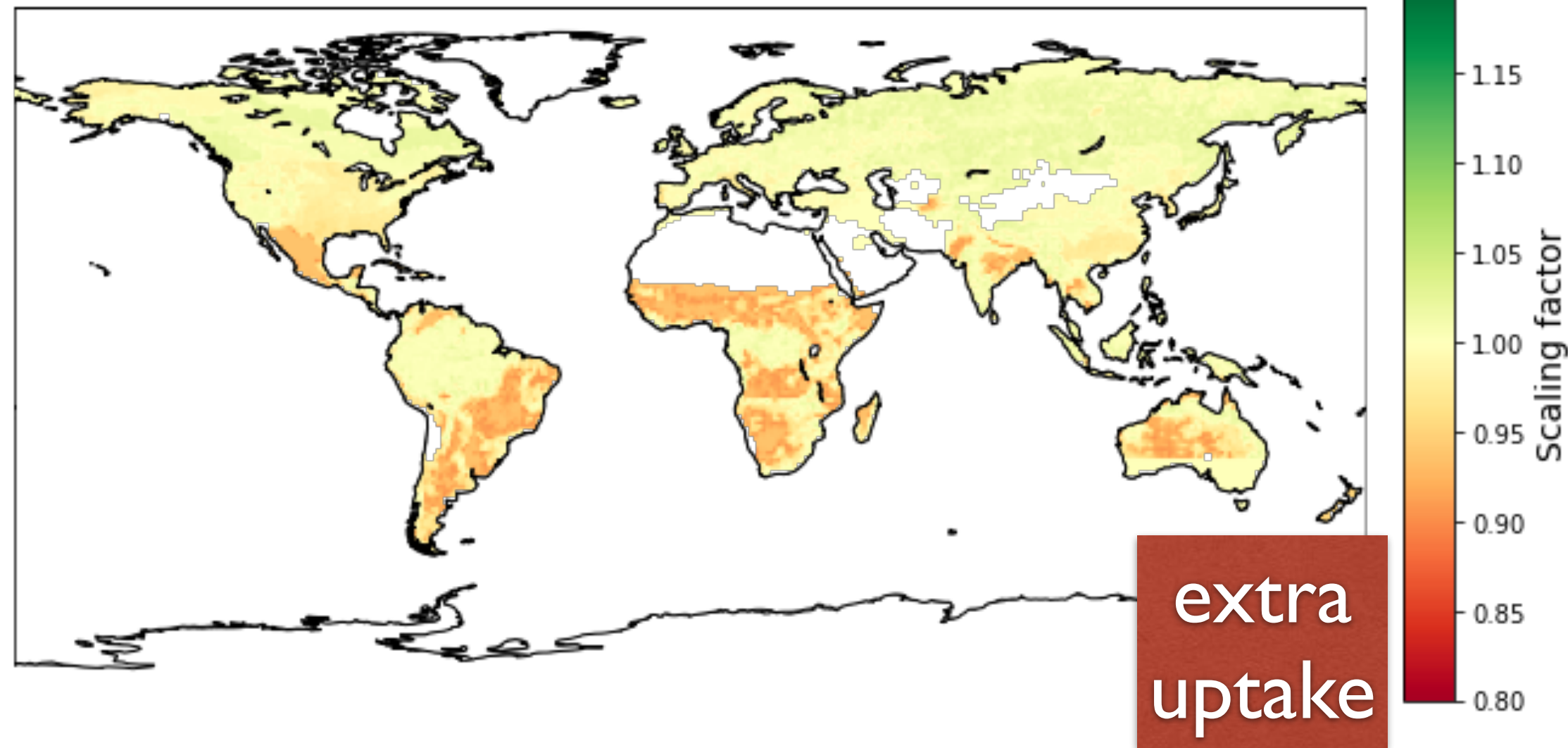
$\Delta F = 365^*$ flux increments to adjust the **seasonal** cycle

$\gamma = 365^*$ multipliers to an “anomaly proxy” ΔP to create **IAV**

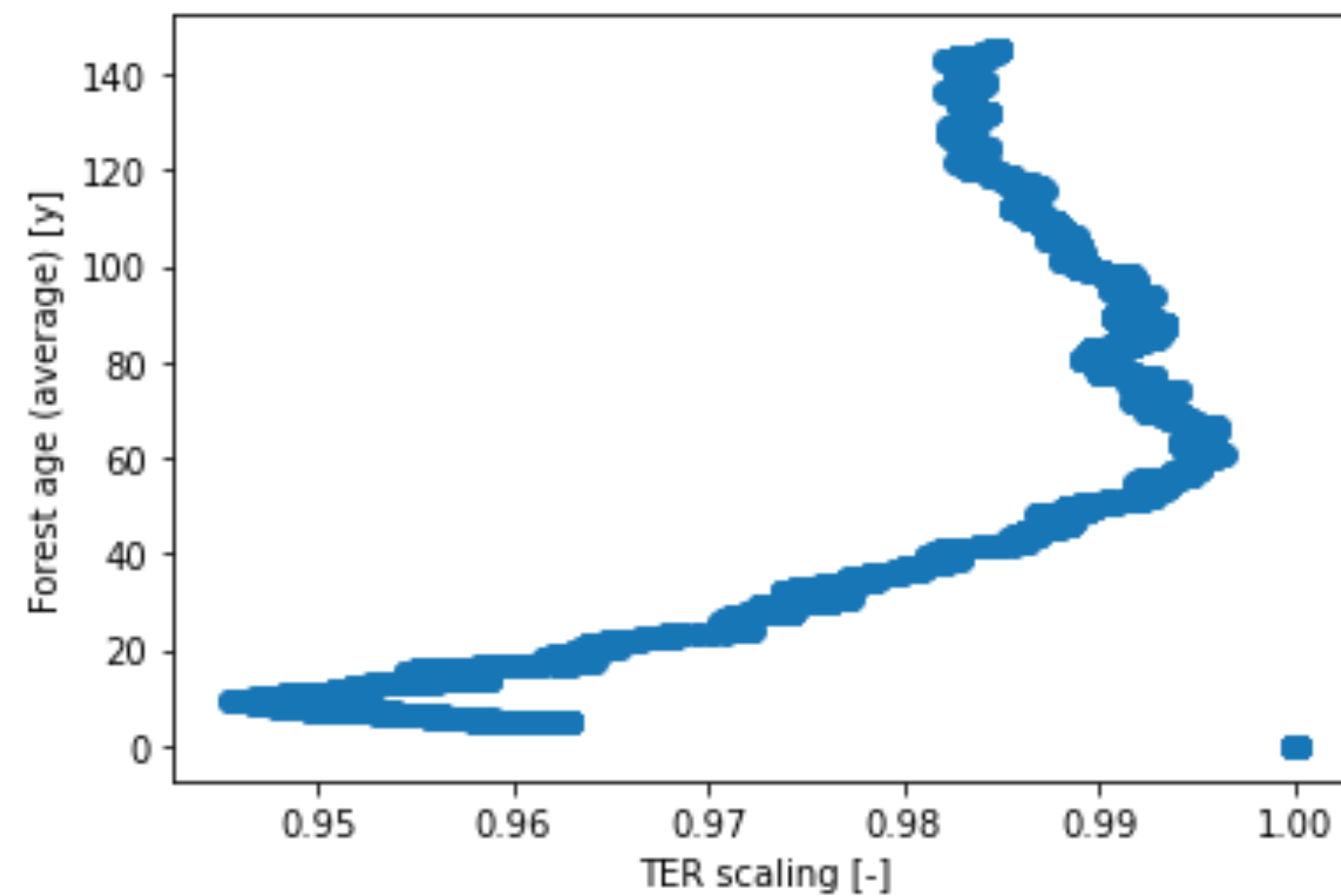
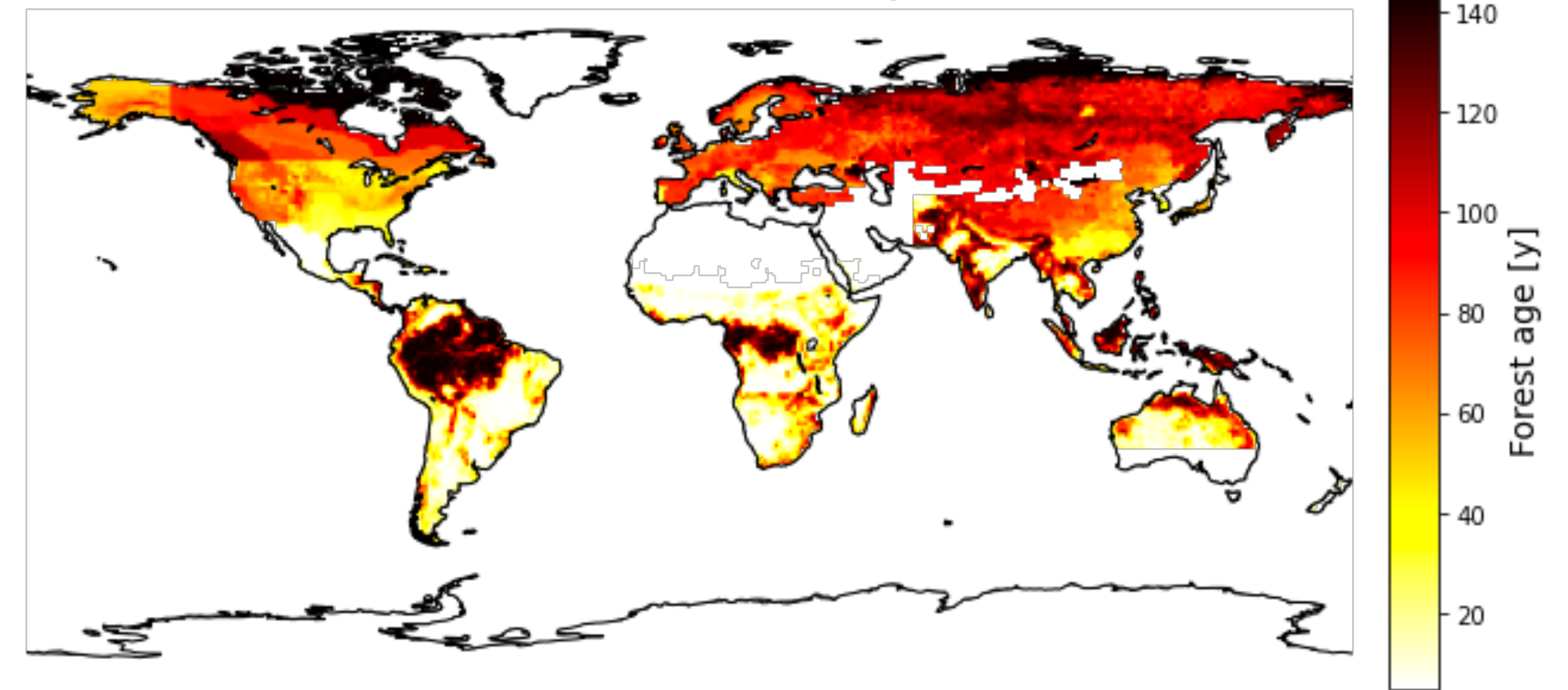


$$F_{optimized} = (\lambda \cdot TER_{prior} + GPP_{prior}) + \lambda F_{ocean} + \Delta F + \gamma \cdot \Delta P$$

$\lambda_{optimized}$



Forest age



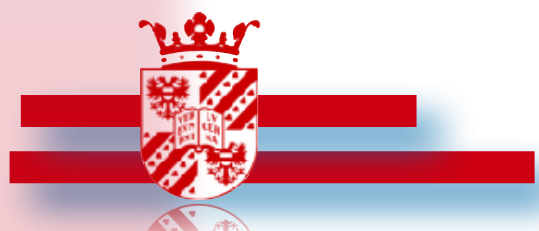
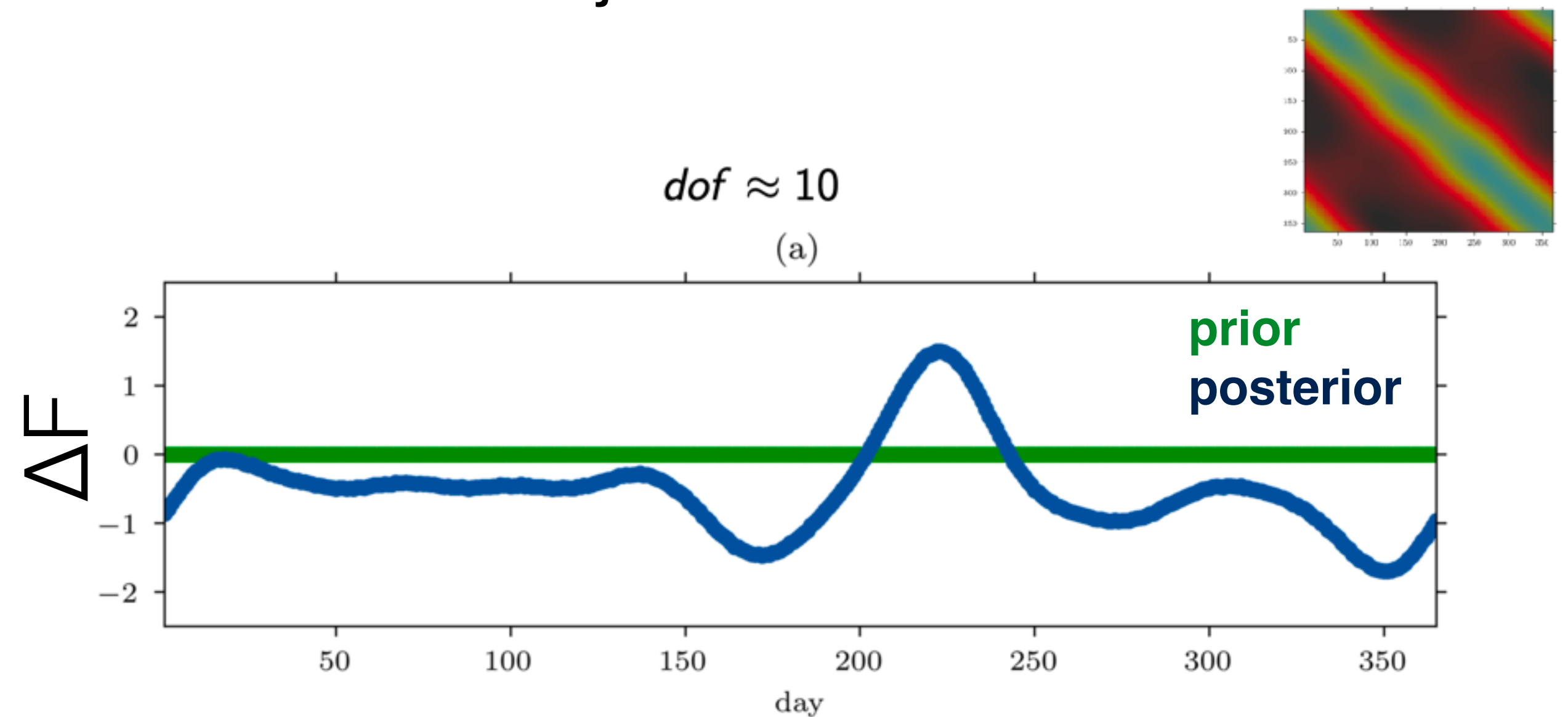
Forest age was used
in the covariance
structure of λ
(9805x9805 matrix)




$$F_{optimized} = (\lambda \cdot TER_{prior} + GPP_{prior}) + \lambda F_{ocean} + \underline{\Delta F} + \gamma \cdot \Delta P$$

ΔF is a daily flux adjustment to SIB4
every DOY (1,...,365) gets one ΔF
 ΔF is thus repeated each year (!)

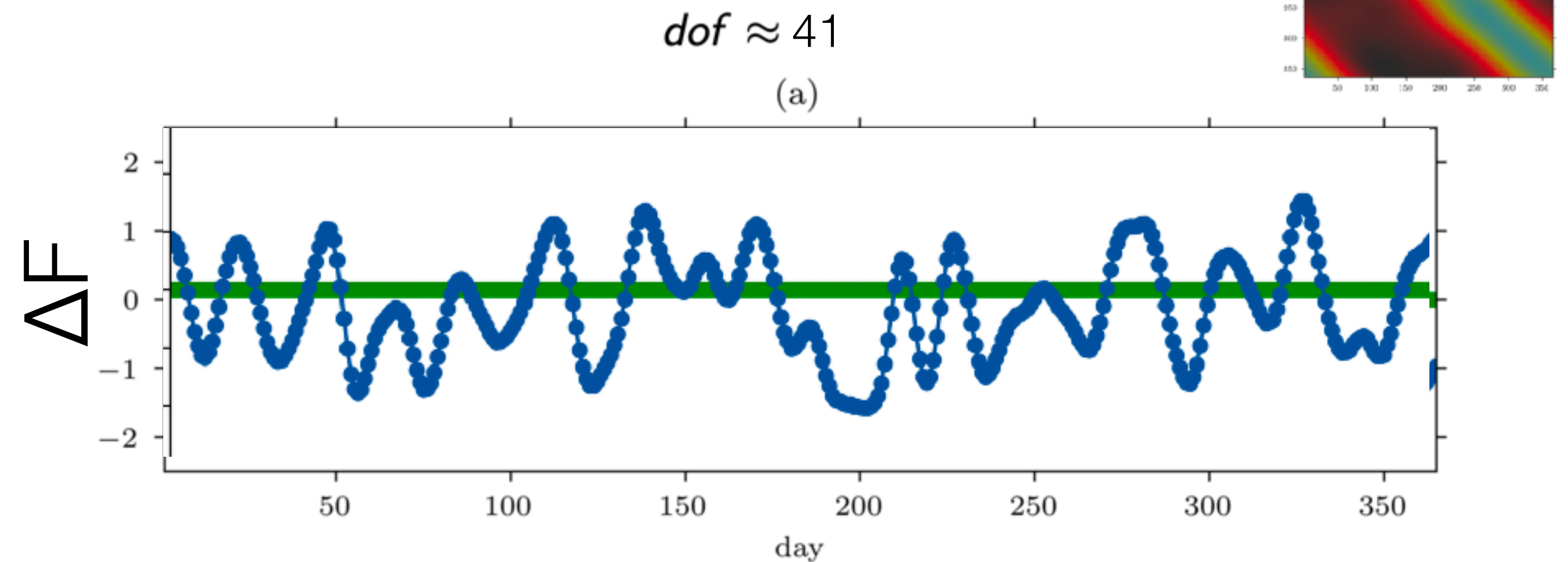
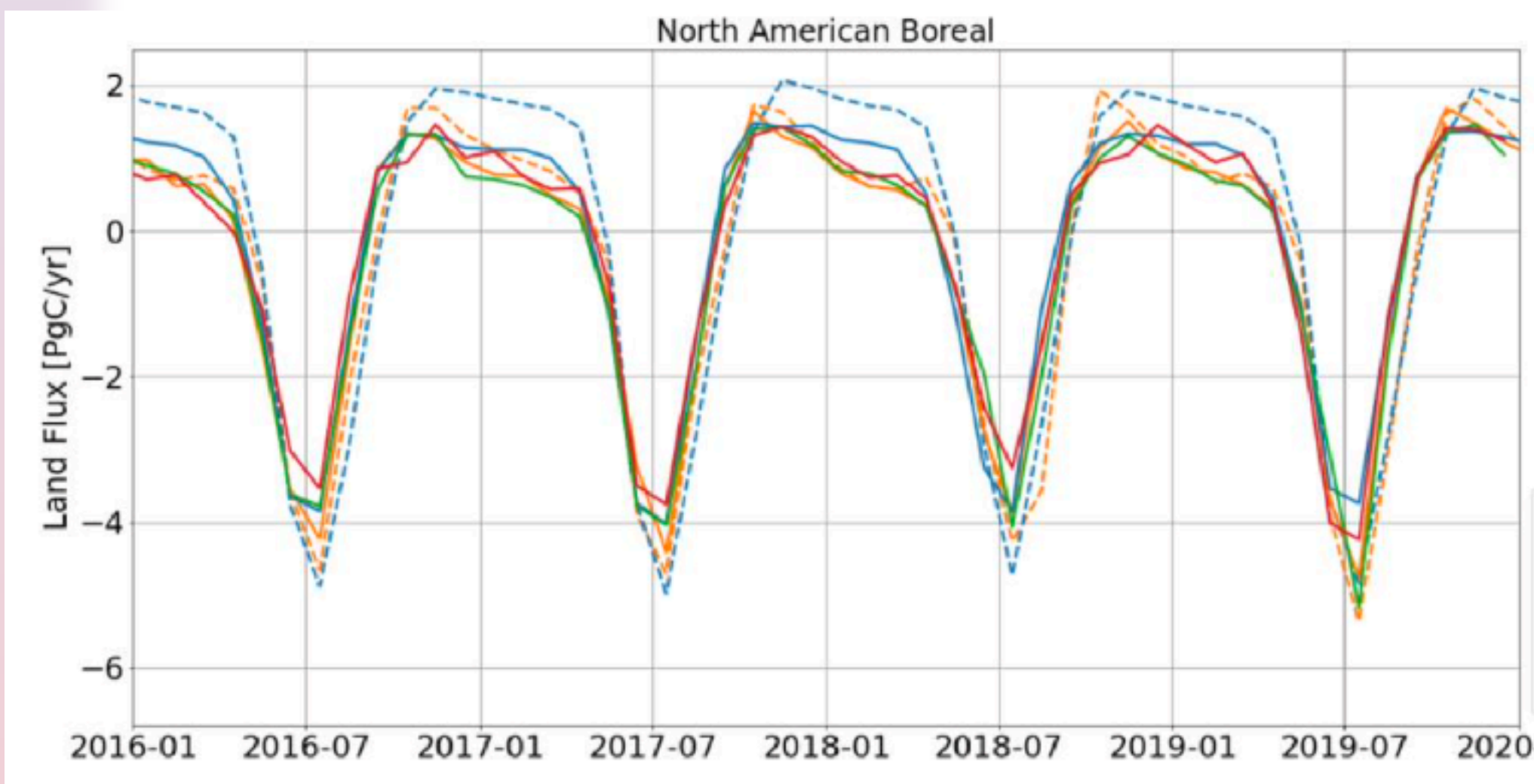
a covariance time-scale makes the adjustment smoother



$$F_{optimized} = (\lambda \cdot TER_{prior} + GPP_{prior}) + \lambda F_{ocean} + \Delta F + \gamma \cdot \Delta P$$

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a covariance time-scale makes the adjustment smoother



— prior SIB4/SIBCASA



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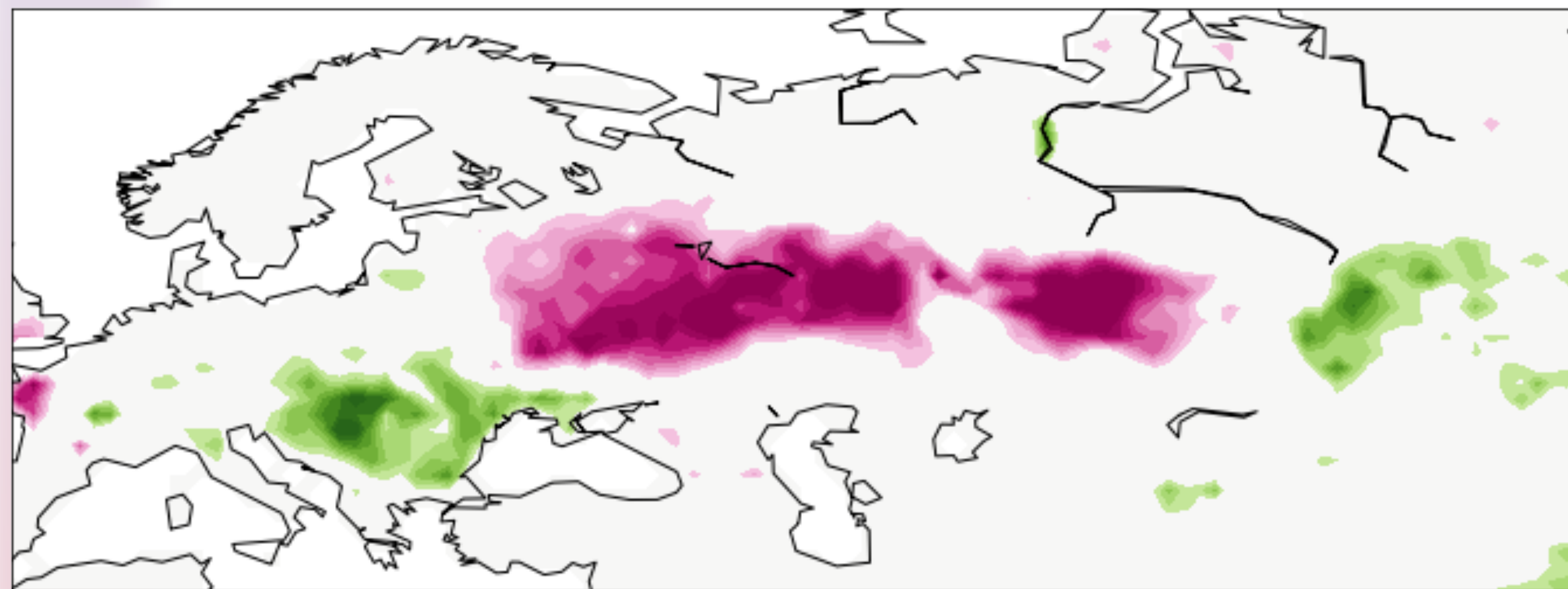
γ is the linear relation between an observed anomaly (ΔP) and a change in flux.

e.g. for ΔT its units would be $(\mu\text{mol}/\text{m}^2/\text{s})/\text{K}$

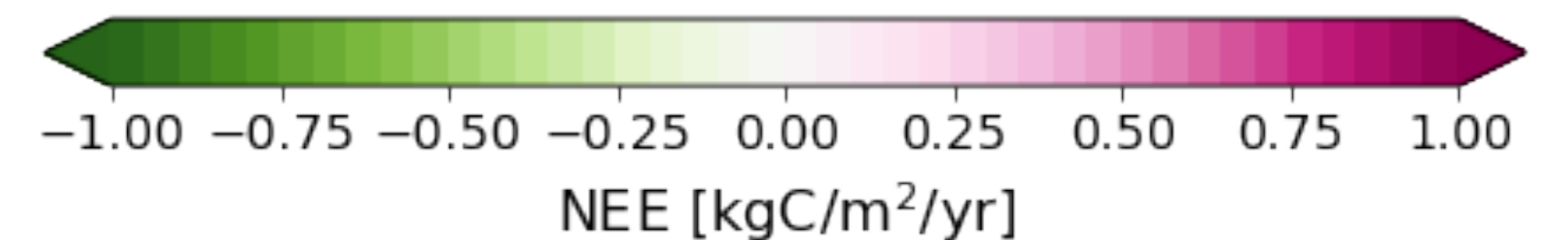
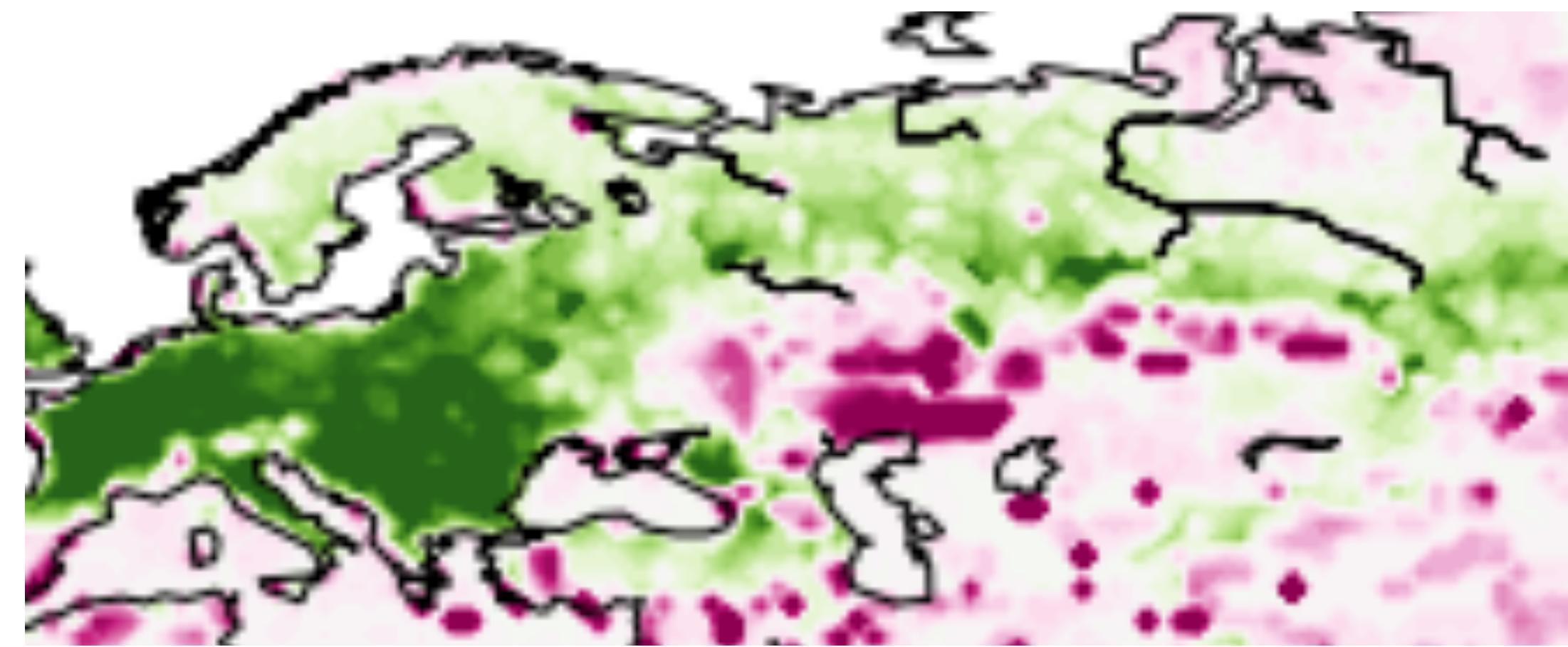
γ is estimated for each DOY (with covariance, like ΔF)

ΔT is relative to the multi-year average T for each day

Proxies we will test: T , VPD , $SPEI$, **NIRv**, SM , ...



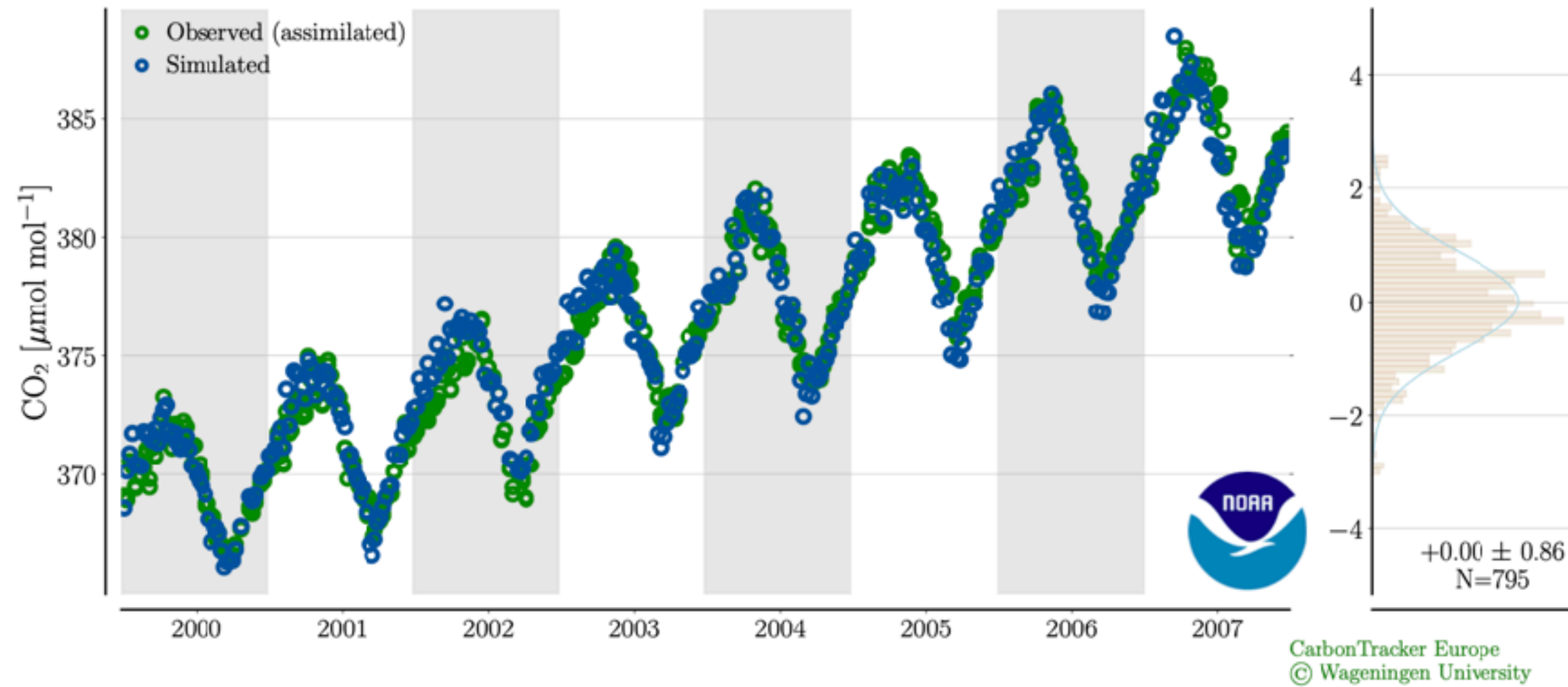
Anomaly in NIRv (photosynthesis) during 2010 July drought in Russia



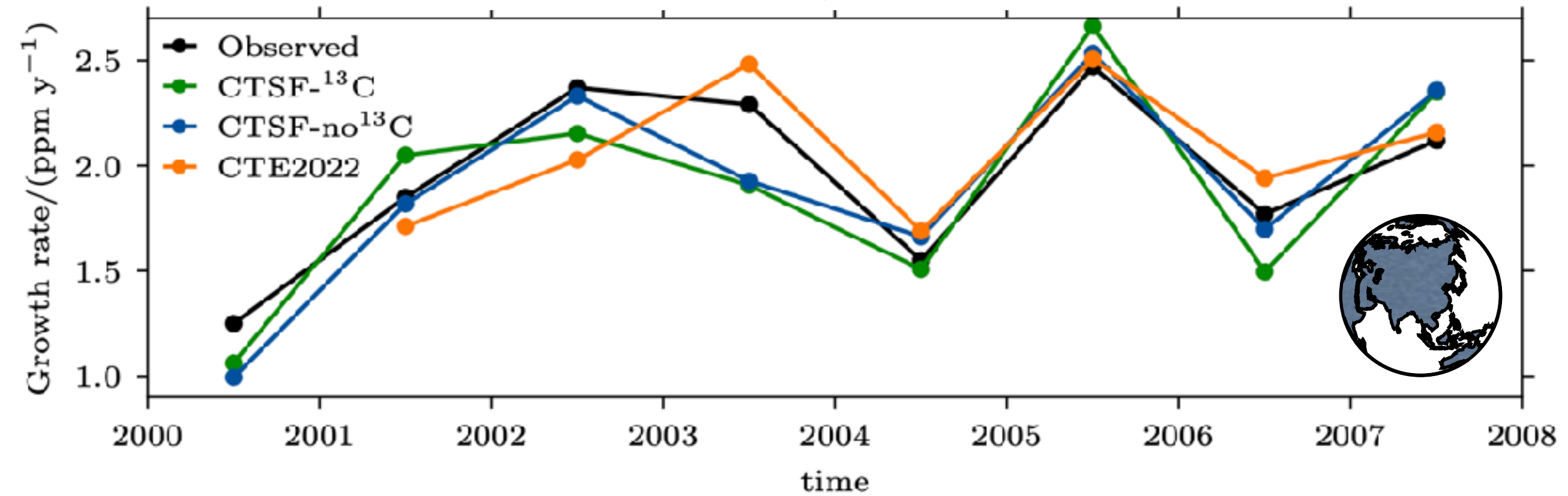


Does it work as well as CT-Europe?

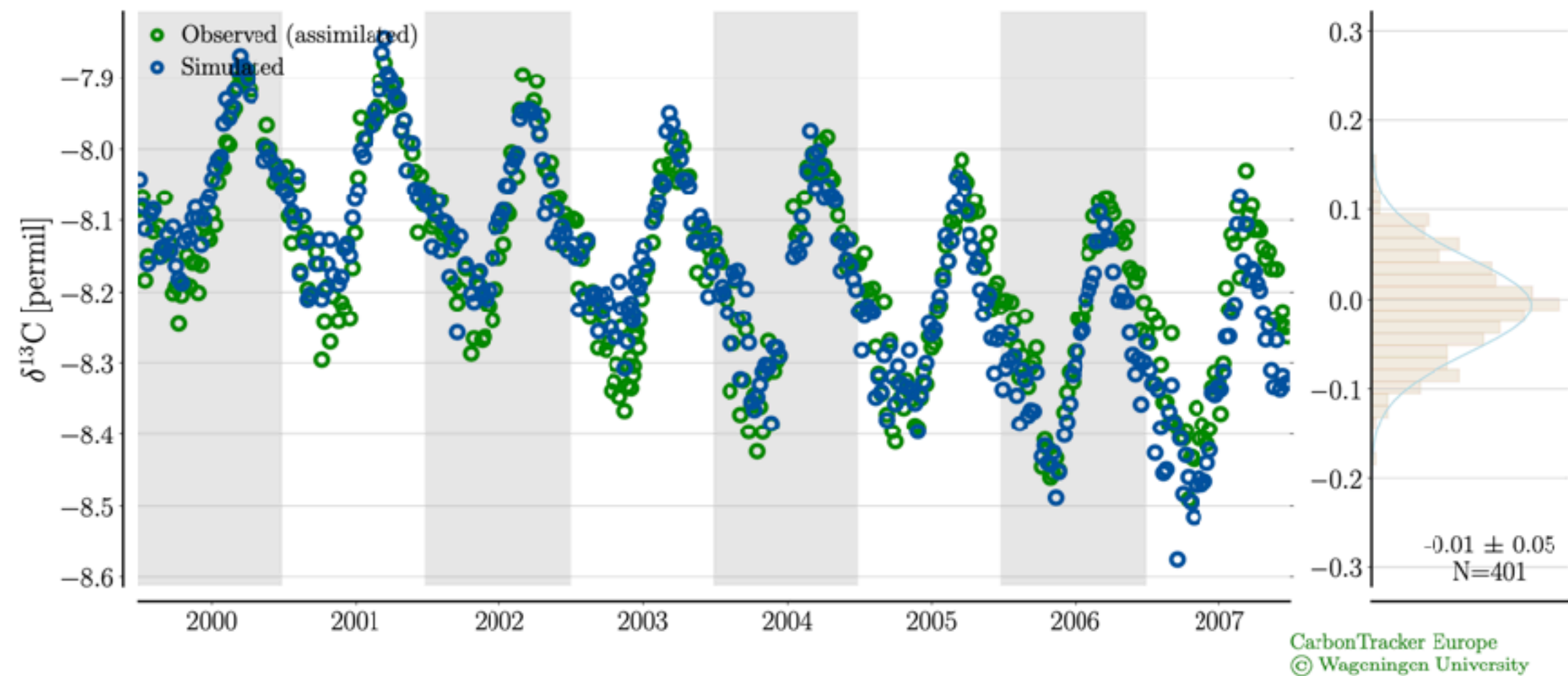
Mauna Loa, Hawaii, United States [19°32'0, 155°35'0, 3397 masl]
surface-flask, NOAA Global Monitoring Laboratory, United States



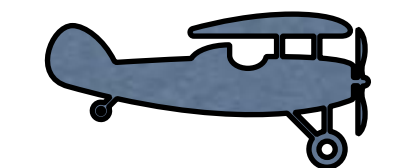
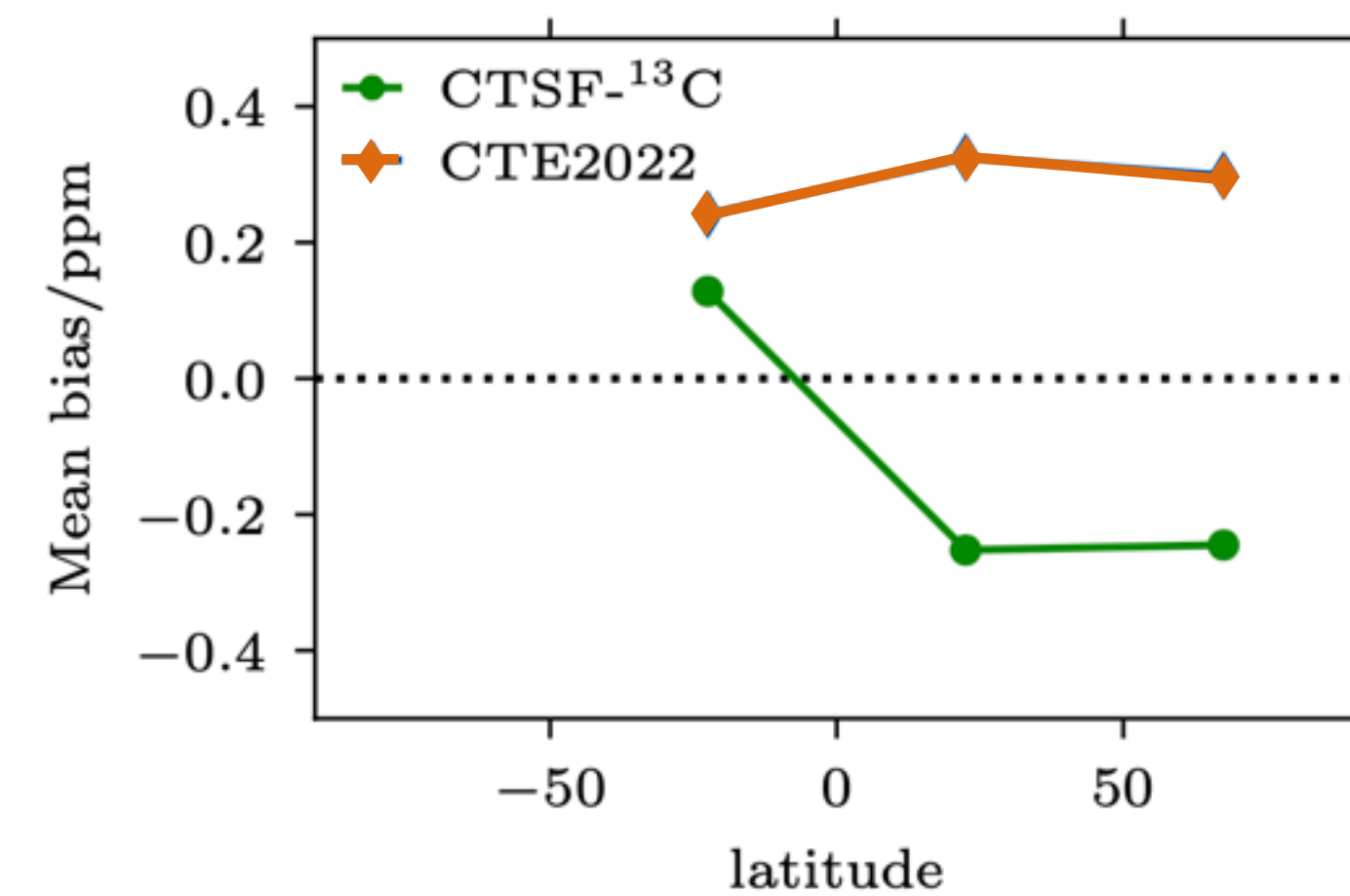
Global CO₂ growth rate



Mauna Loa, Hawaii, United States [19°32'0, 155°35'0, 3397 masl]
surface-flask, Institute of Arctic and Alpine Research, United States



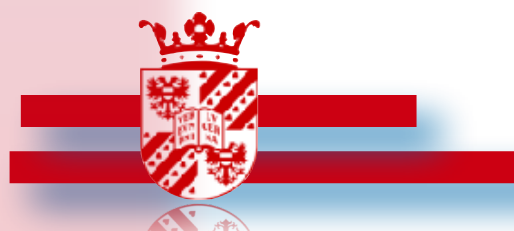
residual vs 2-5 km aircraft CO₂





Developments towards Copernicus

- With the long-window system we cover time scales that will never be captured in CT-Europe, or in the IFS-based MVS (24-hour 4dVAR)
- It is suited for long-term reanalyses and seasonal-to-decadal carbon exchange studies
- It is 6x cheaper than CT-Europe (runtime -3 days/decade)
- It can use spatial data and observations not easily integrated into CT-Europe or IFS-MVS
- Its use frees up resources to focus satellite-based inversions and multi-tracer runs on smaller time+space scales (Anne-Wil van den Berg)
- CT-Europe and CT-long window are integrated in the ongoing design of a global MVS...
- ... + collaboration on OpenIFS (20 km global) and EC-Earth4-CC-lite



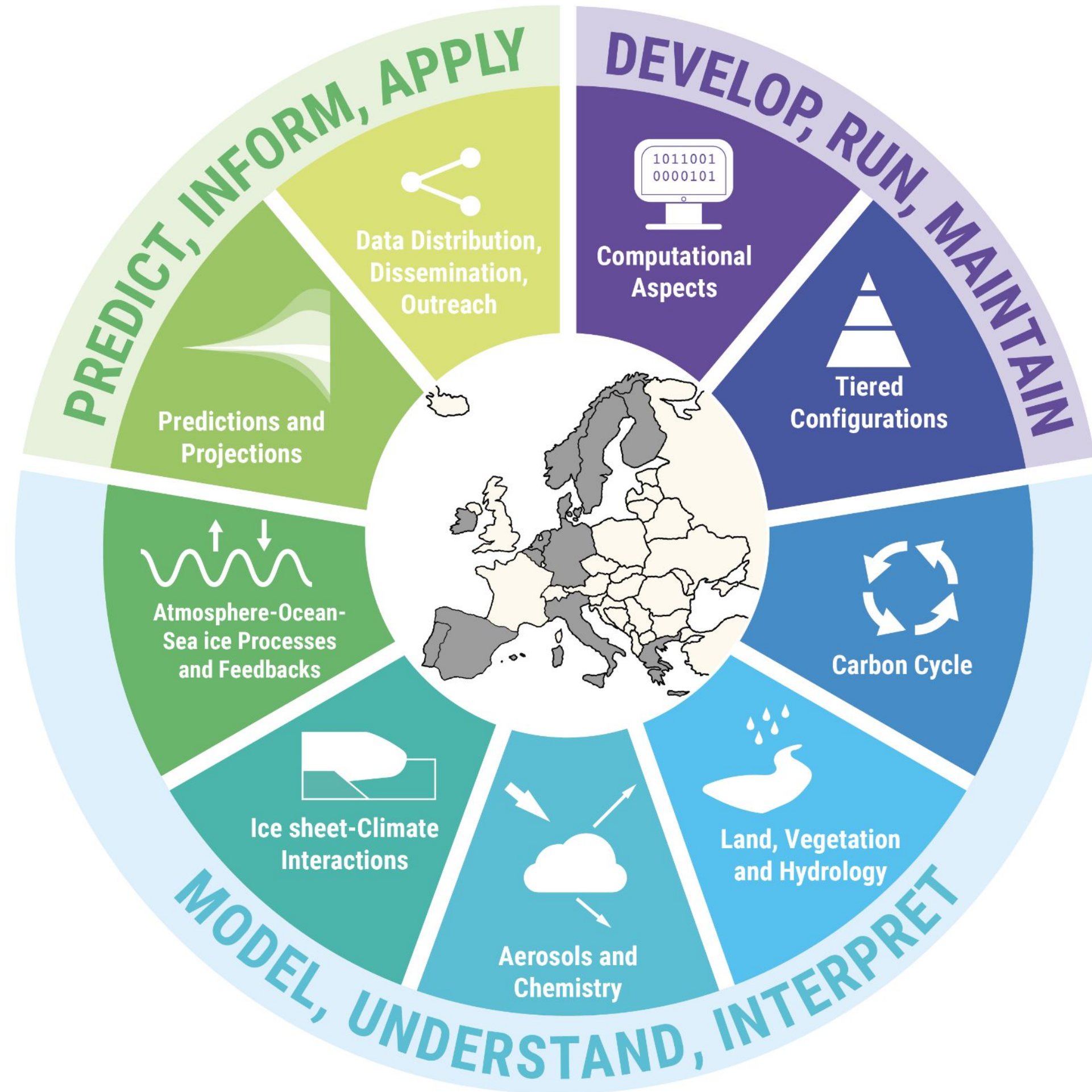
OpenIFS/CC Members

- **BSC** : Etienne Tourigny, Iria Ayan, Raffaele Bernardello
 - Etienne & Raffaele developed the c-cycle version of EC-Earth3 with TM5 for CO2 transport, linking CO2 to LPJ-GUESS (land/vegetation) and PISCES (OBGC)
 - Etienne & Iria working on CO2 transport in OpenIFS for EC-Earth4
 - OptimESM project: building EC-Earth4 for high resolution applications, to start production end 2024
- **WUR** : Wouter Peters, Anne-Wil van den Berg, Joram Hooghiem
 - CO2 transport for flux inversion with in OpenIFS to replace system using TM5 (nudged to ERA5)
 - CORSO global modeling project starting 1/1/2023
- **UU** : Gerbrand Koren
 - development of a set of simple biosphere fluxes at regional scale currently in testing
 - PhD-project with focus on tropical carbon exchange starting mid-2023
- **MPI BGC** : Alexander Winkler
 - OpenIFS to replace TM3 used to study atmospheric CO2 transport and sensitivity to land fluxes
- **AWI** : Judith Hauck, Christopher Danek
 - AWI-ESM3, similar to EC-Earth4 with FESOM
 - Interested in CO2 transport in OpenIFS, links to FESOM/REcoM for Ocean fluxes

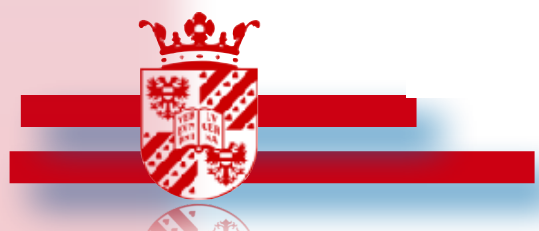
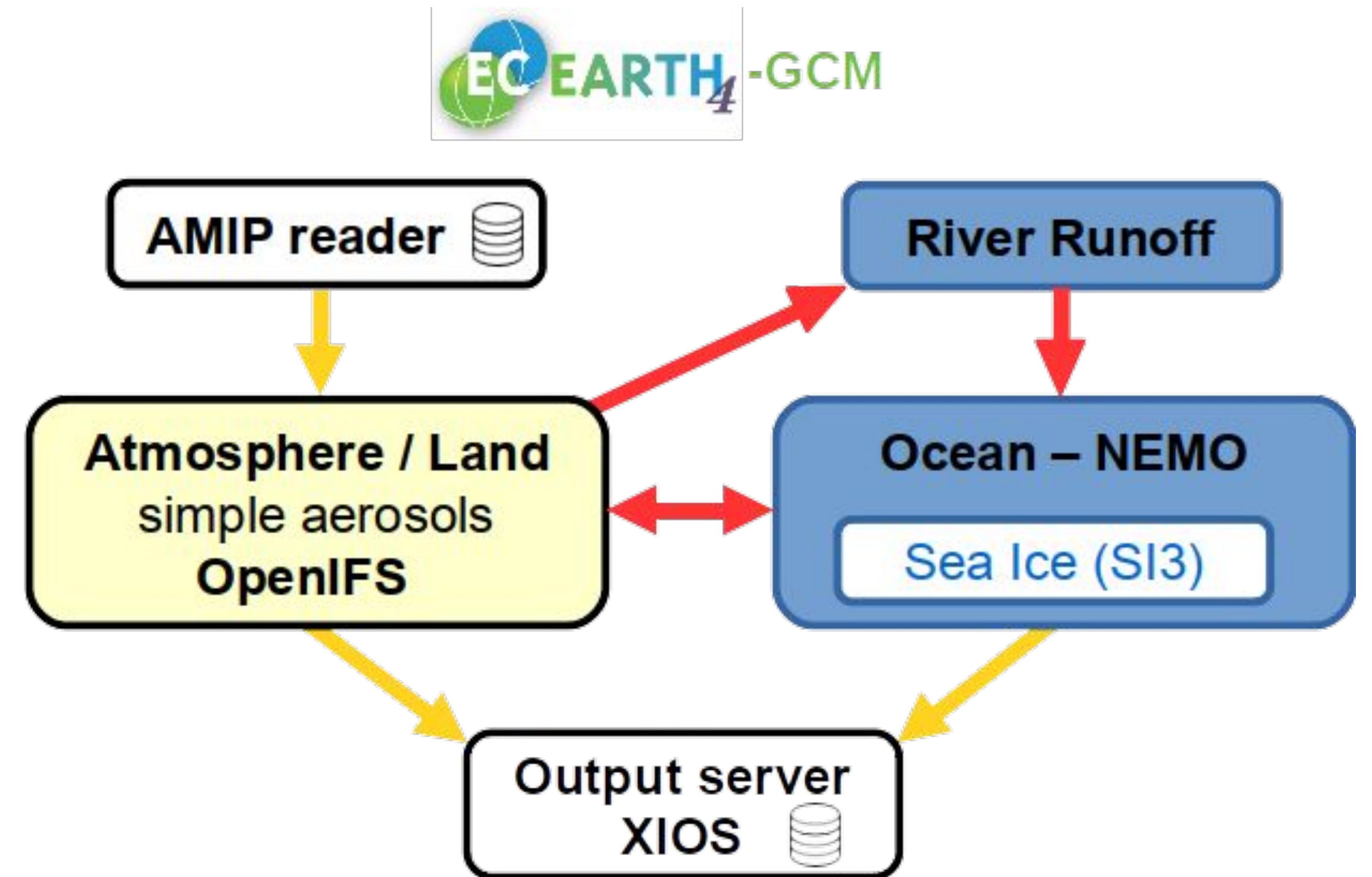




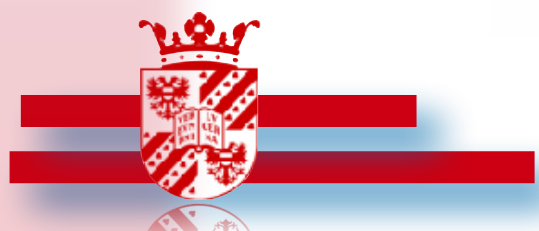
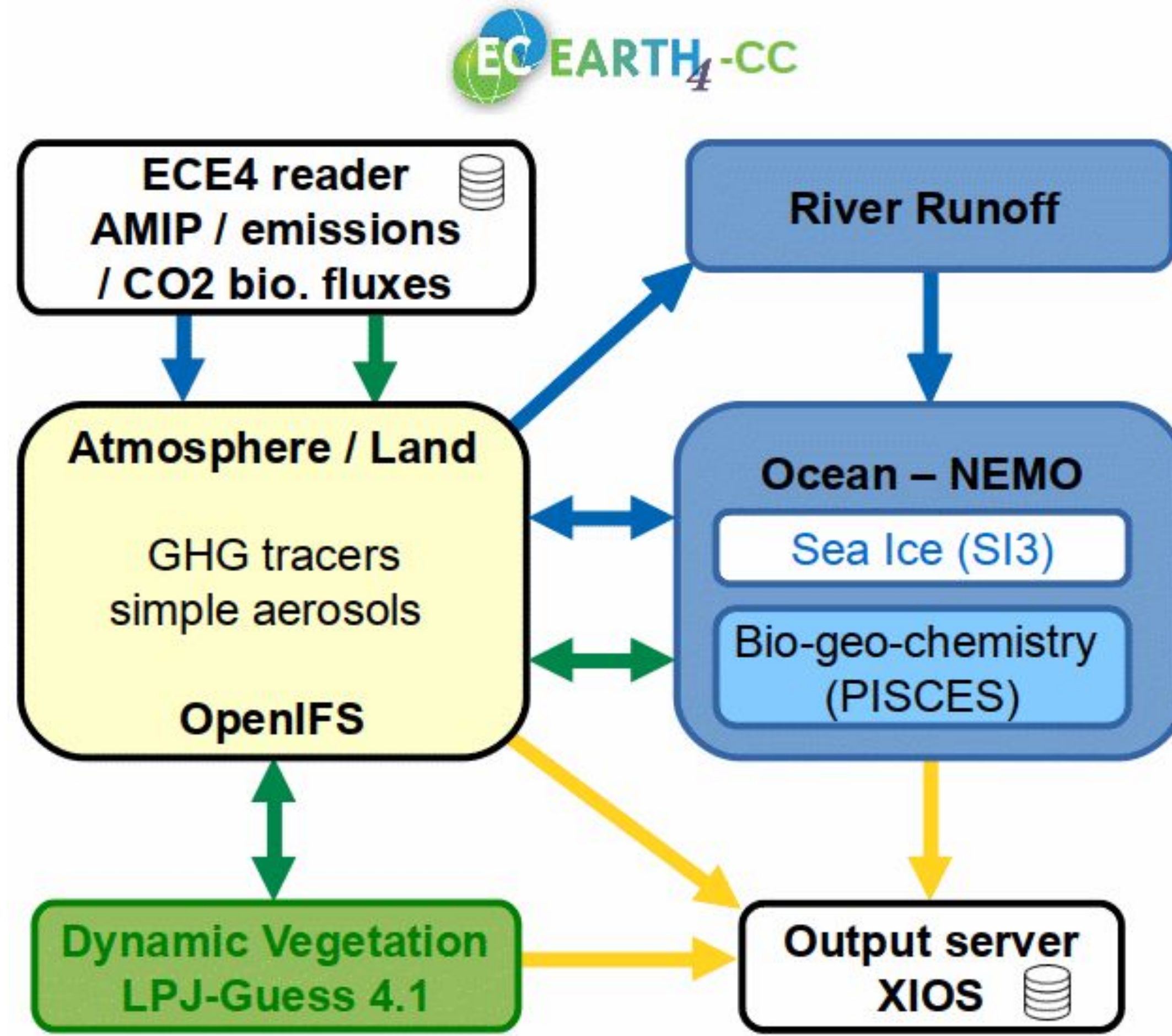
Earth System Model to advance process understanding and deliver evidence-based support for climate applications



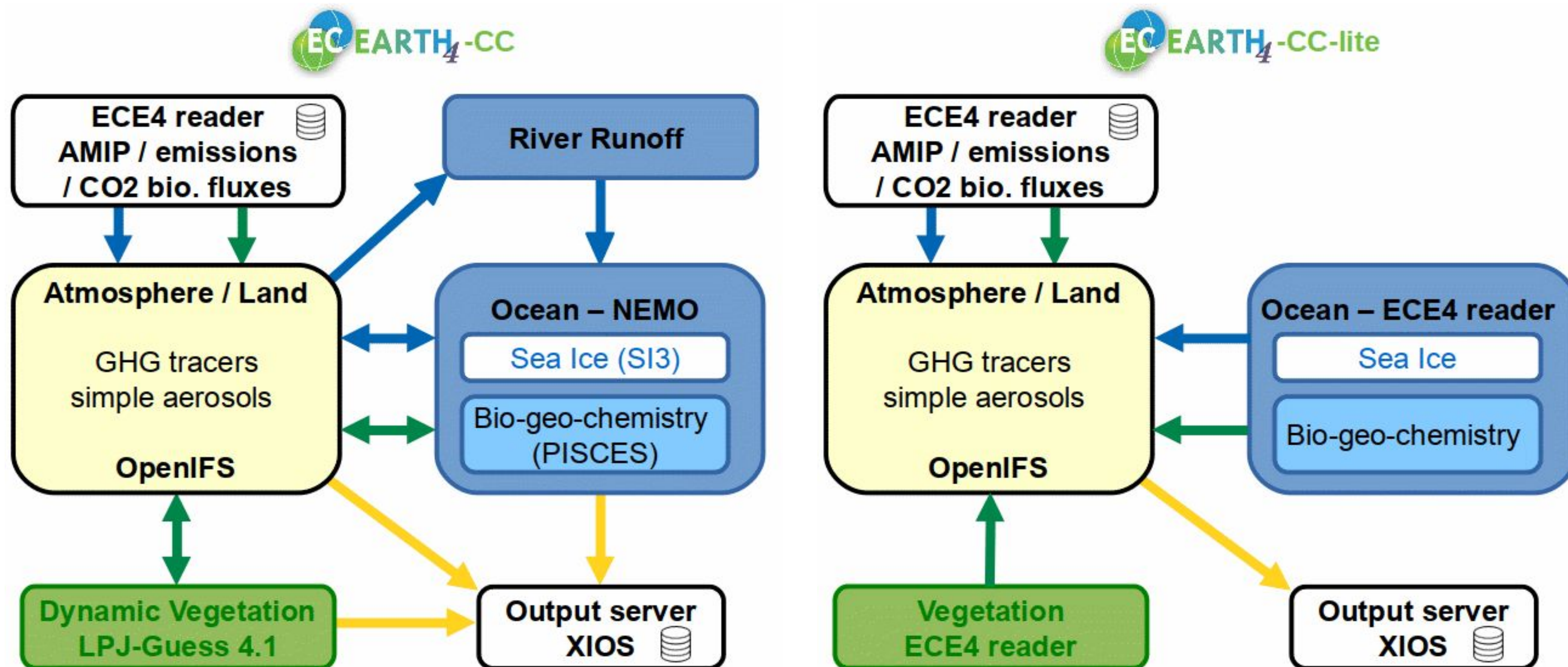
EC-Earth4



EC-Earth4 roadmap / EC-Earth4-CC



EC-Earth4 roadmap / EC-Earth4-CC





OpenIFS/CC Update

- EC-Earth4:
 - Currently runs on a few machines e.g. ECMWF HCP2020 (aka ATOS), BSC Marenostrum4
 - Simple AOGCM/AMIP setups without CMIP6 forcings
 - CMIP6 forcings and simplified aerosols to be available soon
 - contains updates to oifs43r3v2 (improved mass fixer), nemo 4.2 and oasis3-mct5 with python interface
 - Initial plan was to run on Tco95L91 grid, but this will probably change to T1159 / T1255
 - Hosted on SMHI github, access requires a licence for OpenIFS and is restricted to EC-Earth consortium members
- Nudging:
 - AWI has scripts & methods to do spectral nudging
 - need to be tested on other setup (e.g. ATOS)
 - BSC can download data and copy it to ATOS
 - need volunteer from OpenIFS/CC to test conversion and

