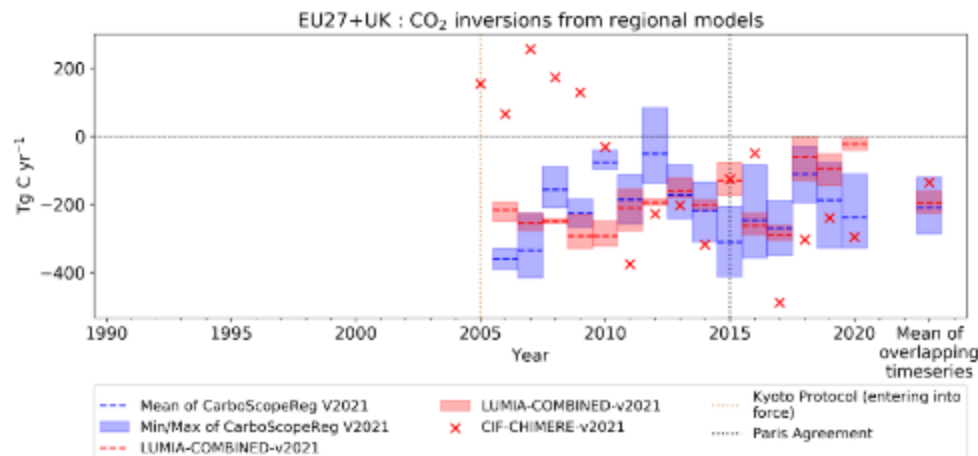


T3.3 Other CO₂ regional inversions !

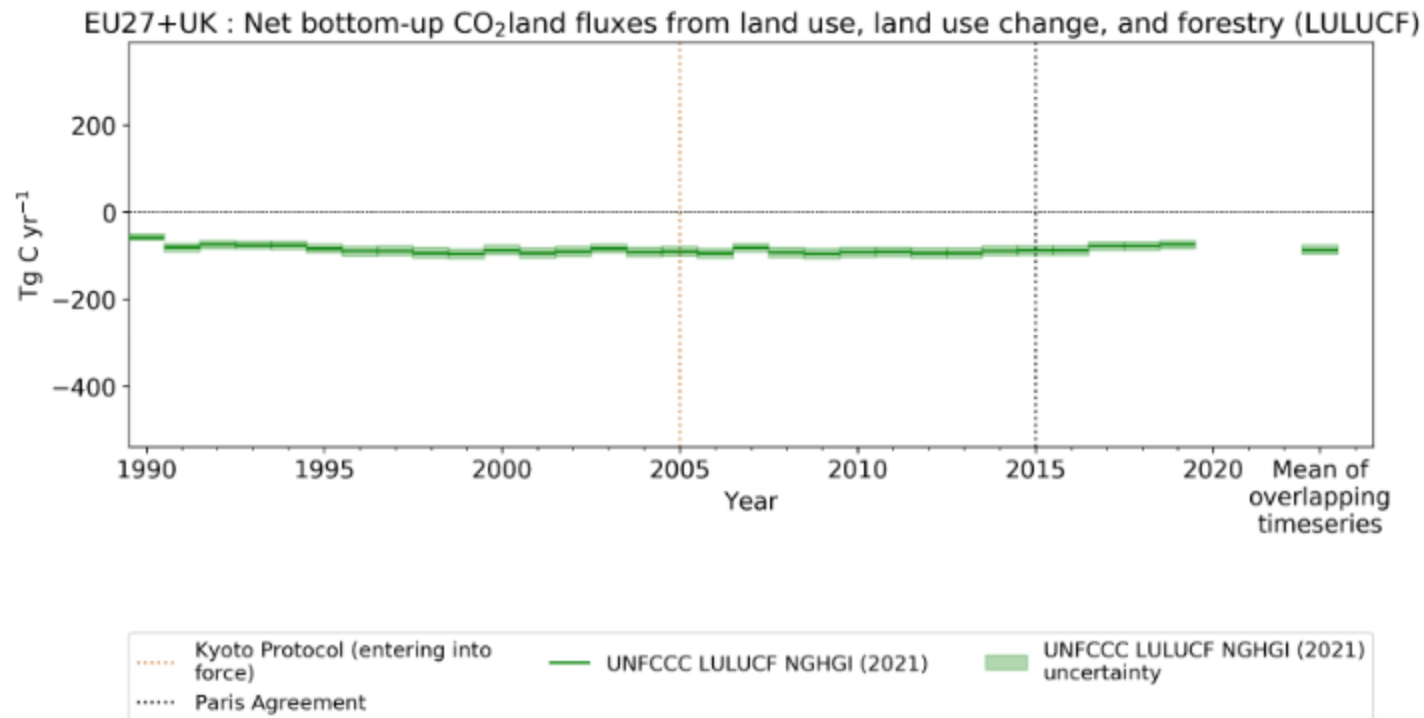
- Community Inversion Framework - CO₂ inter-comparison
 - CIF - CHIMERE is working : first results obtained
 - CIF - LMDZ (global) completed
 - CIF - STILT / Flexpart underway
- As well as LUMIA inversion system
 - ⇒ Differences that need to be resolved !
- Synthesis in WP5 still use the different estimates
(See summary talk (P. Peylin) for a few comparisons)



WP3 – NBP ATTRIBUTION

High uncertainty in LULUCF fluxes

Inventories

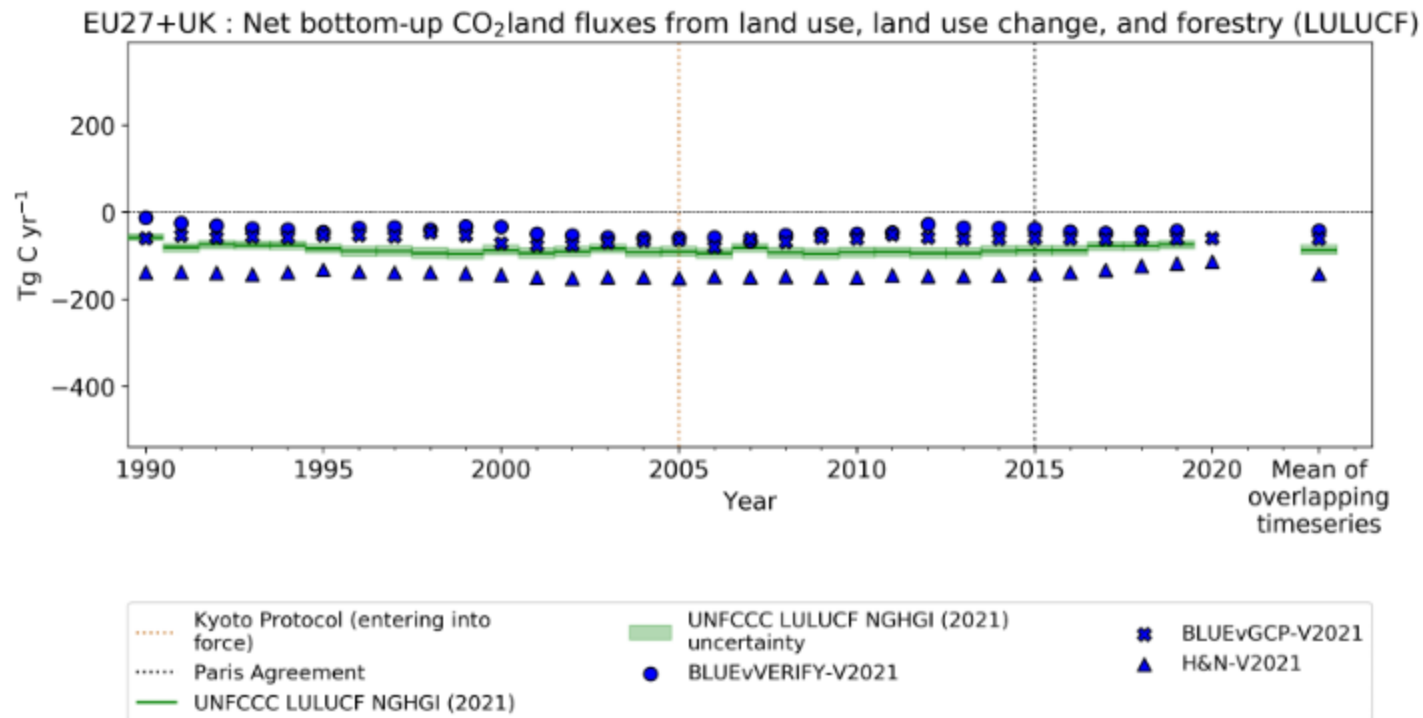


WP3 – NBP ATTRIBUTION

High uncertainty in LULUCF fluxes

Inventories

Bookkeeping



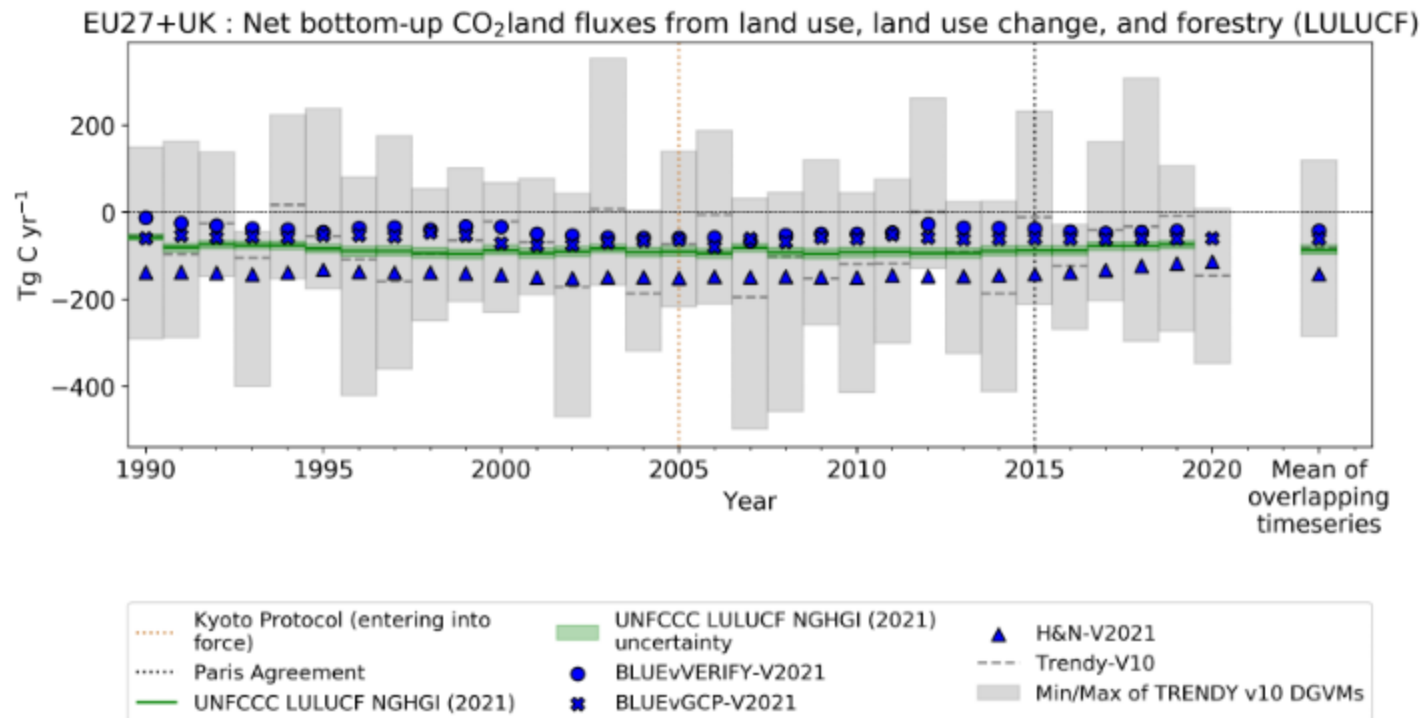
WP3 – NBP ATTRIBUTION

High uncertainty in LULUCF fluxes

Inventories

Bookkeeping

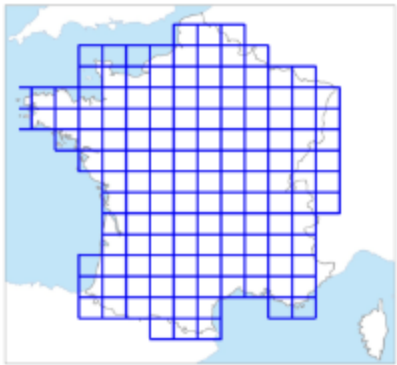
DGVMs





WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

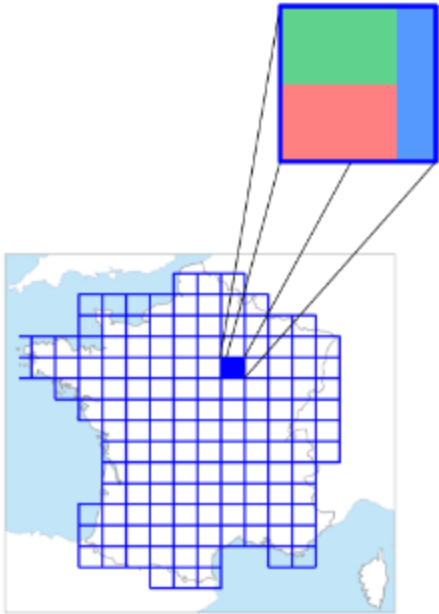




WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

20% Evergreen forest
40% C3 Grasslands
40% C3 Croplands

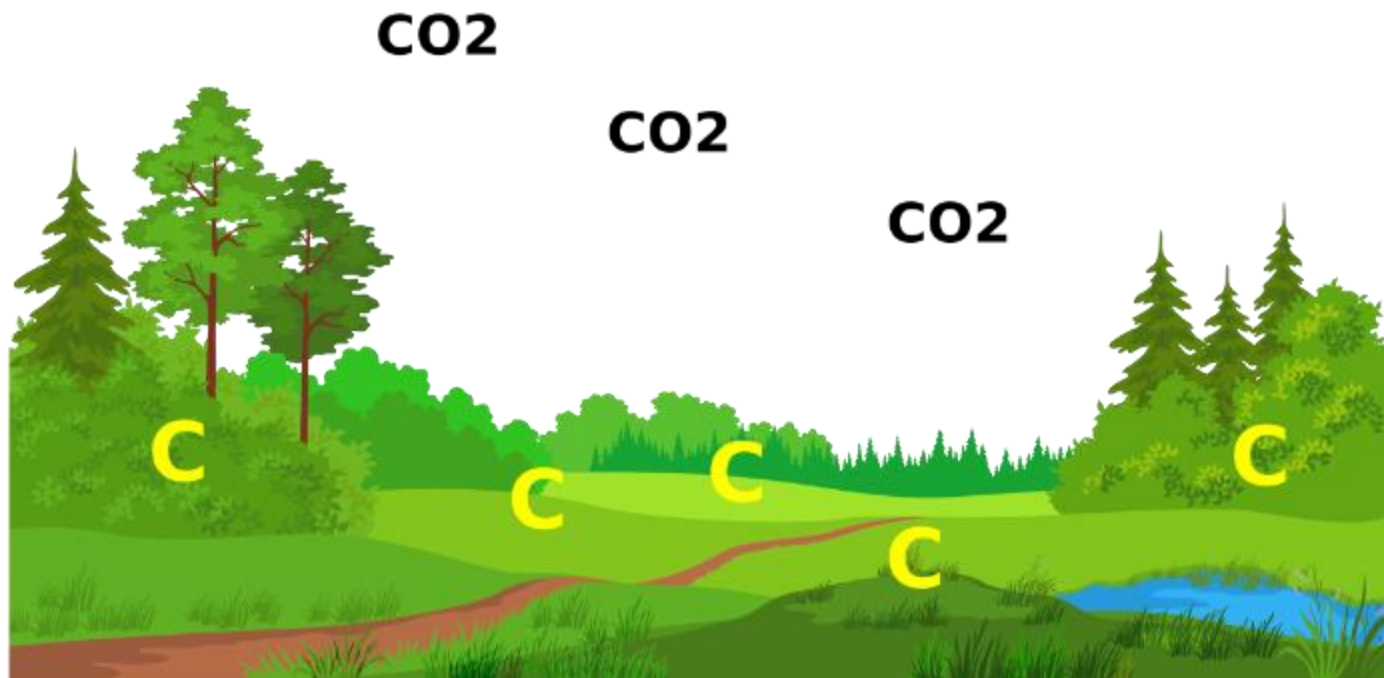
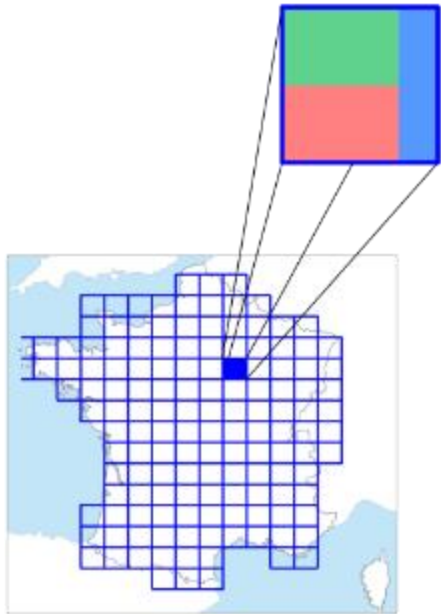


WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Net biome production (NBP)

20% Evergreen forest
40% C3 Grasslands
40% C3 Croplands



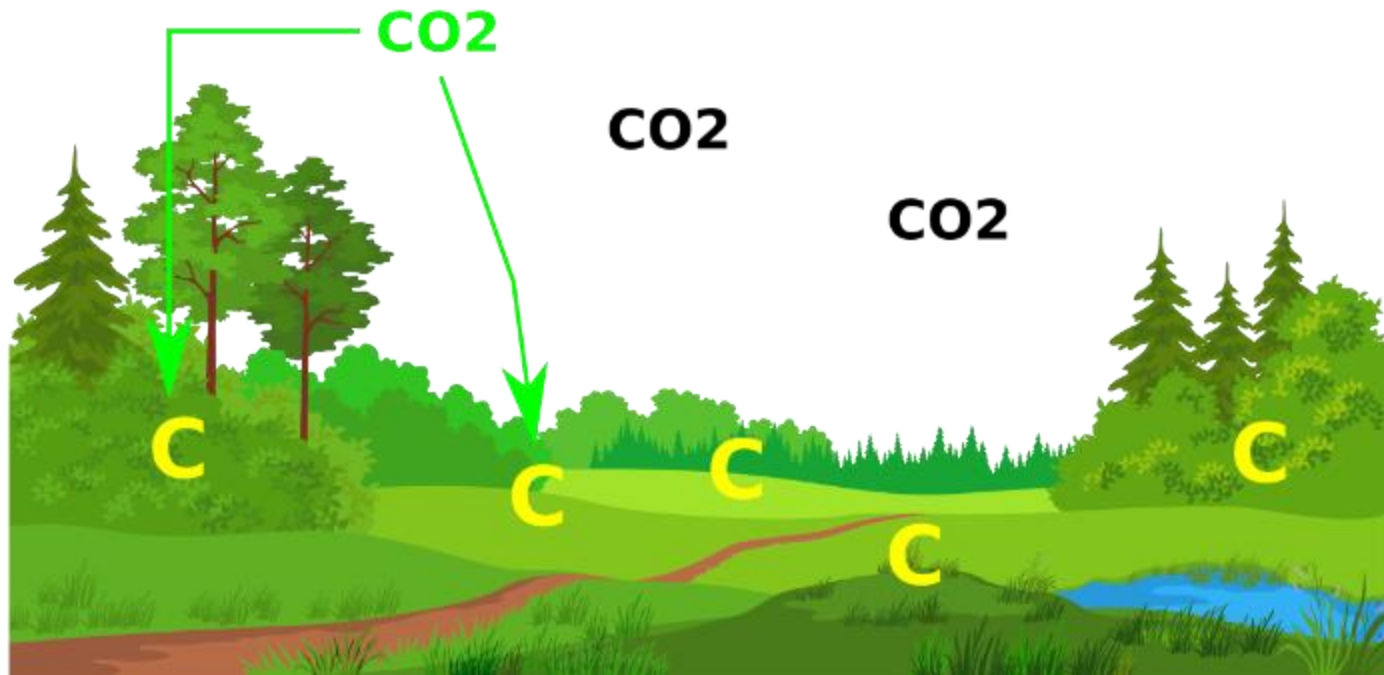
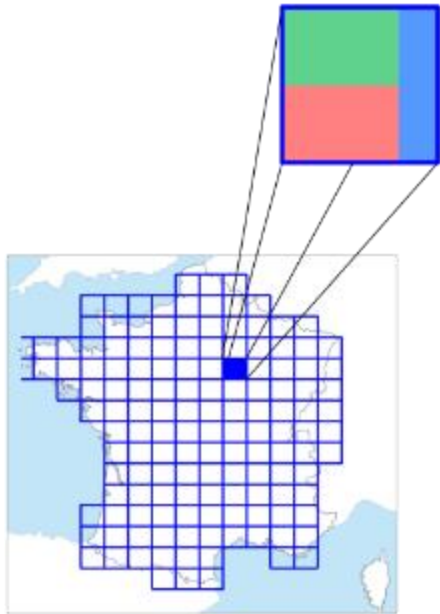
WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Net biome production (NBP)

$$\text{NBP} = \text{Photo}$$

20% Evergreen forest
40% C3 Grasslands
40% C3 Croplands



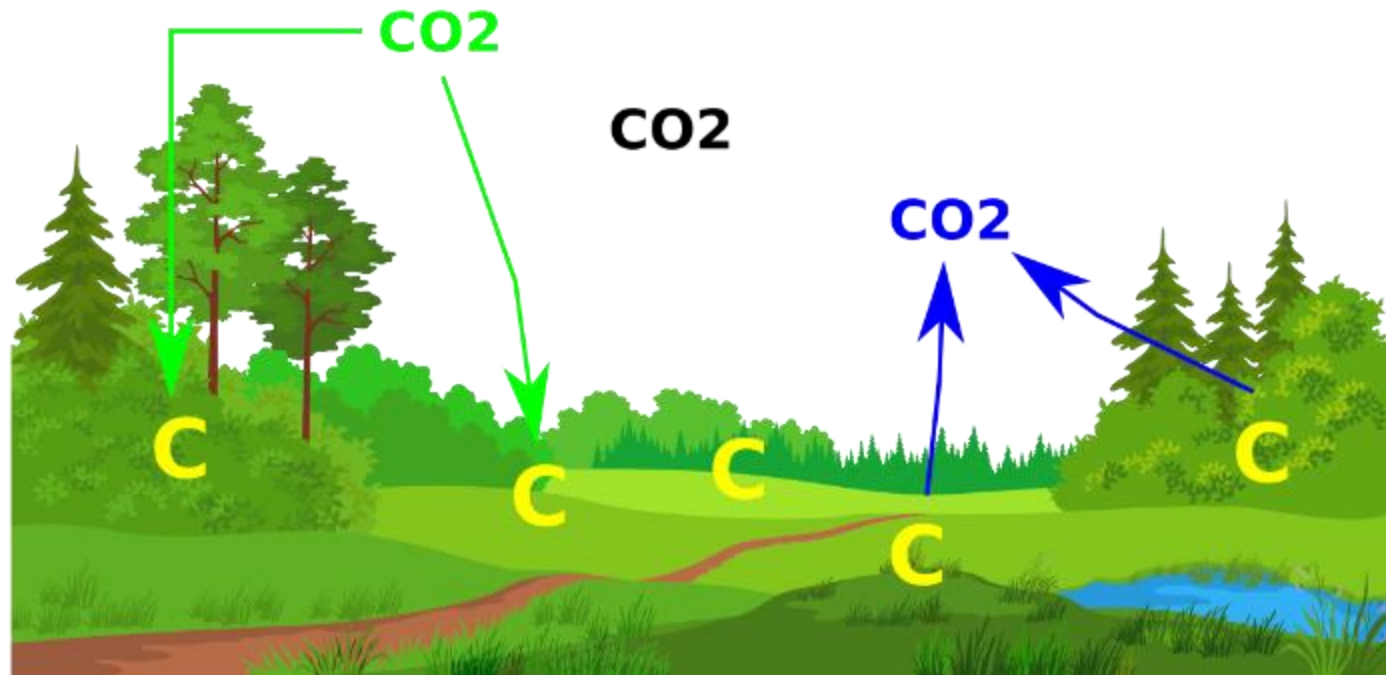
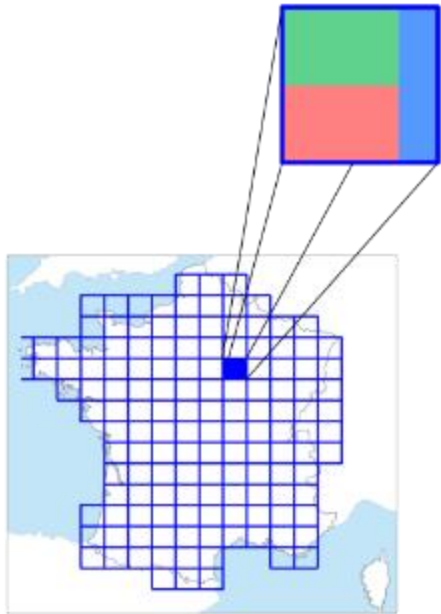
WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Net biome production (NBP)

$$\text{NBP} = \text{Photo} - \text{Resp}$$

20% Evergreen forest
40% C3 Grasslands
40% C3 Croplands



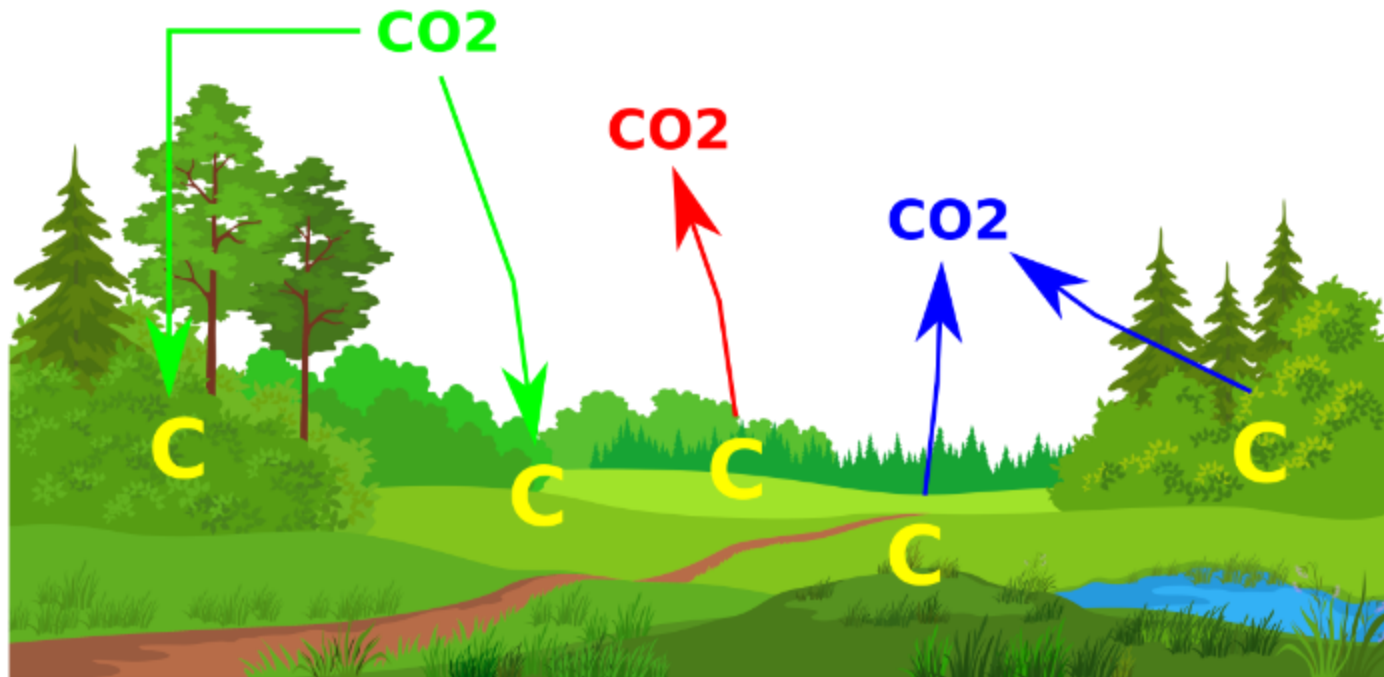
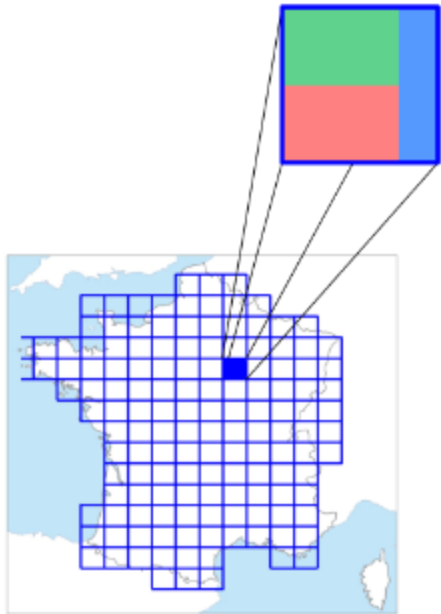
WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Net biome production (NBP)

$$\text{NBP} = \text{Photo} - \text{Resp} - \text{Harv}$$

20% Evergreen forest
40% C3 Grasslands
40% C3 Croplands



WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

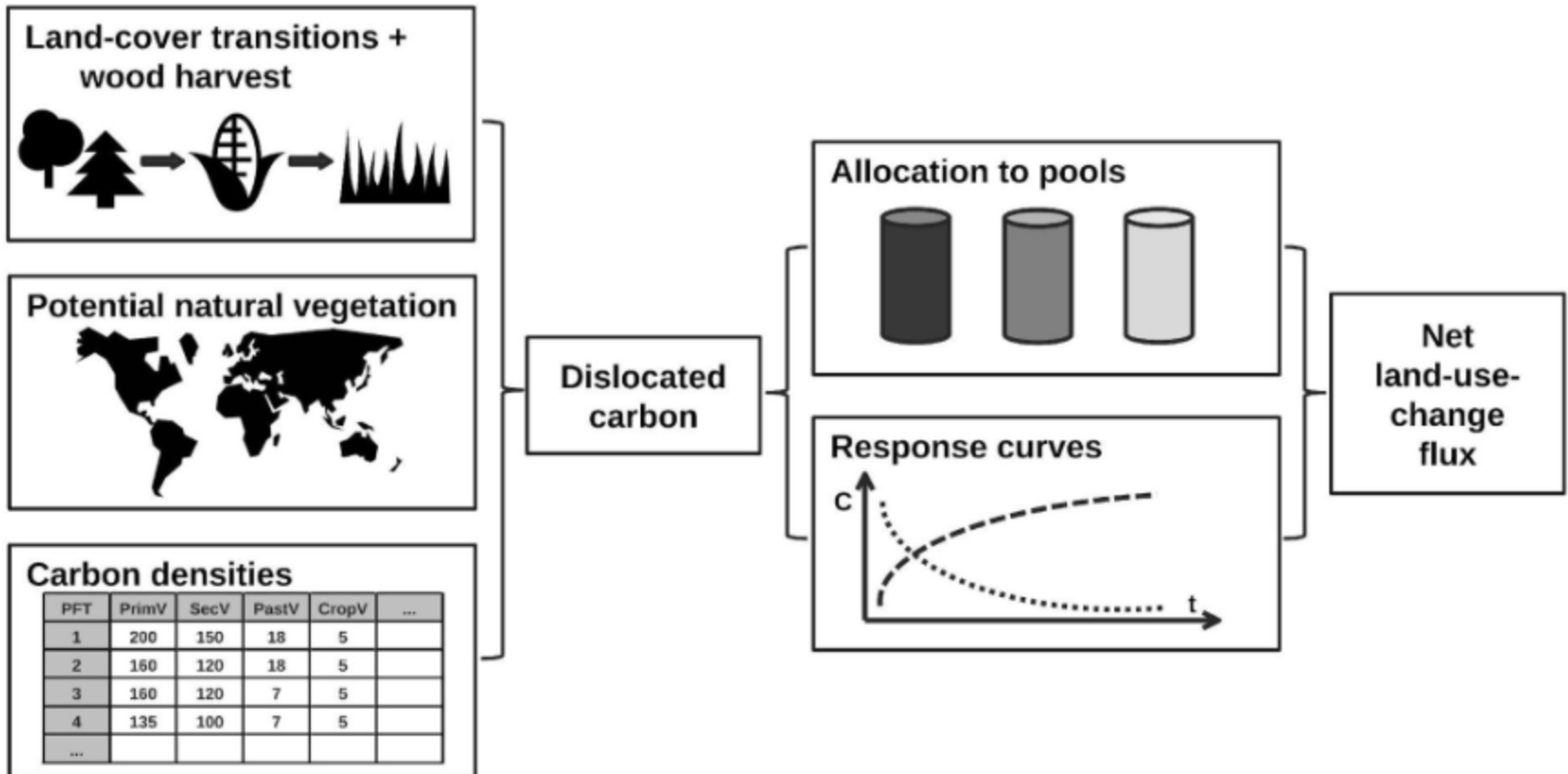
Factorial experiments

	S0	S1	S2	S3	S4 (if app.)
CO2	static	dynamic	dynamic	dynamic	dynamic
Climate	static	static	dynamic	dynamic	dynamic
Land cover/land use	static	static	static	dynamic	dynamic
Nitrogen deposition (if applicable)	static	static	static	dynamic	static

Difference between simulations gives the effect of that driver (e.g., S2-S1 gives the climate influence)

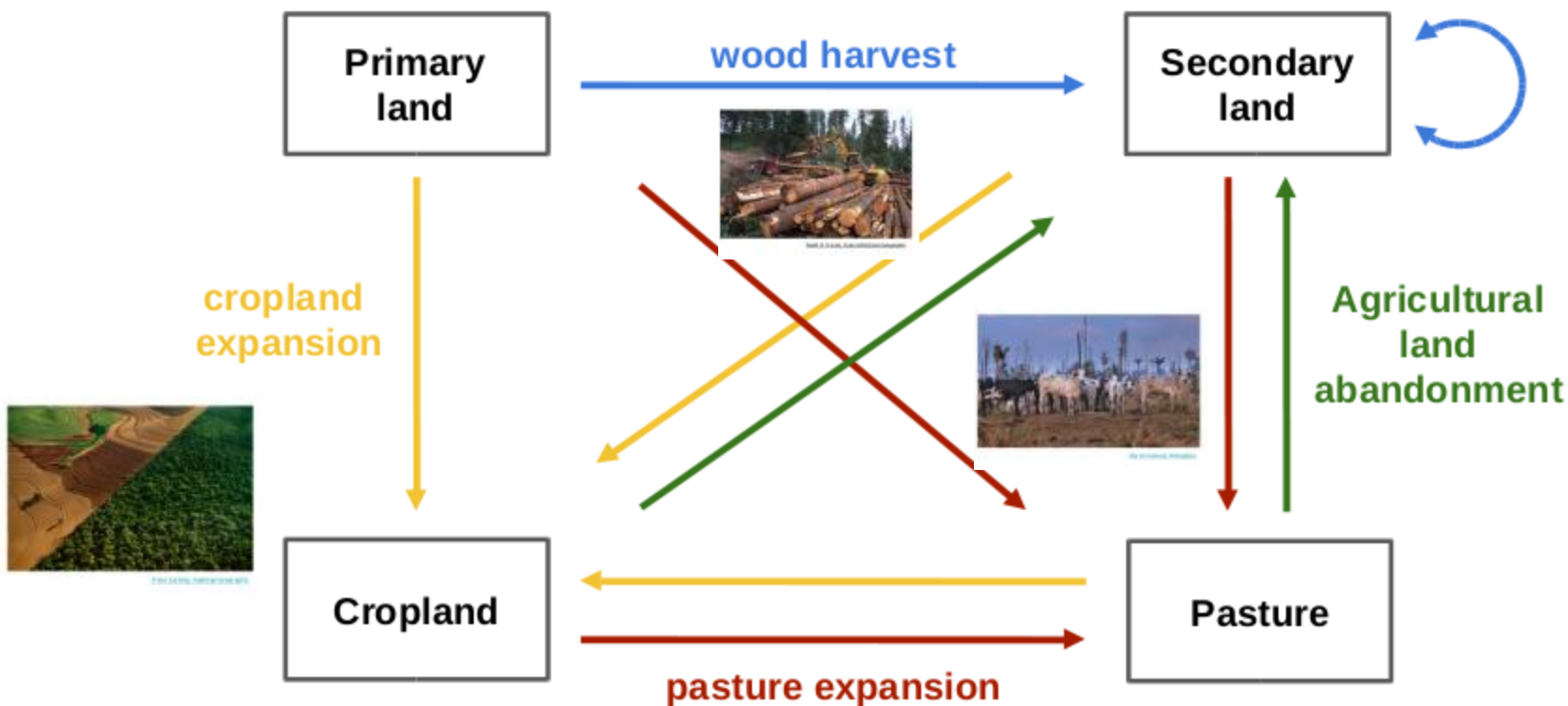
WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

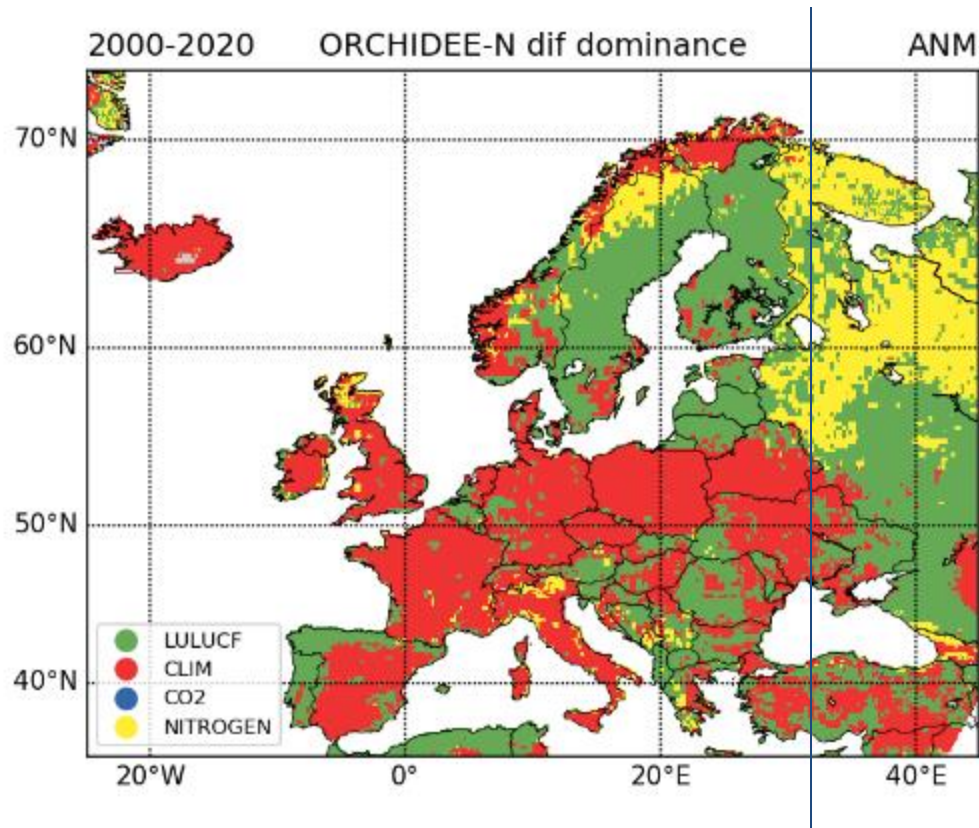


Adapted from Kerstin Hartung

WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

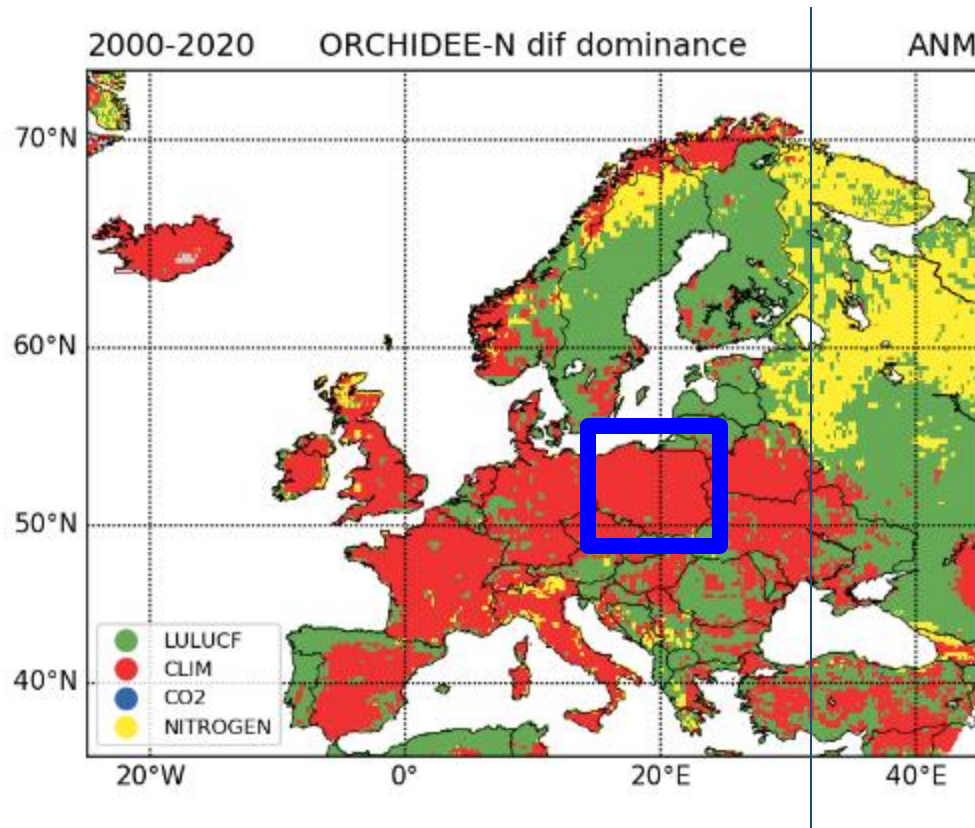
Factorial experiments



WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Factorial experiments

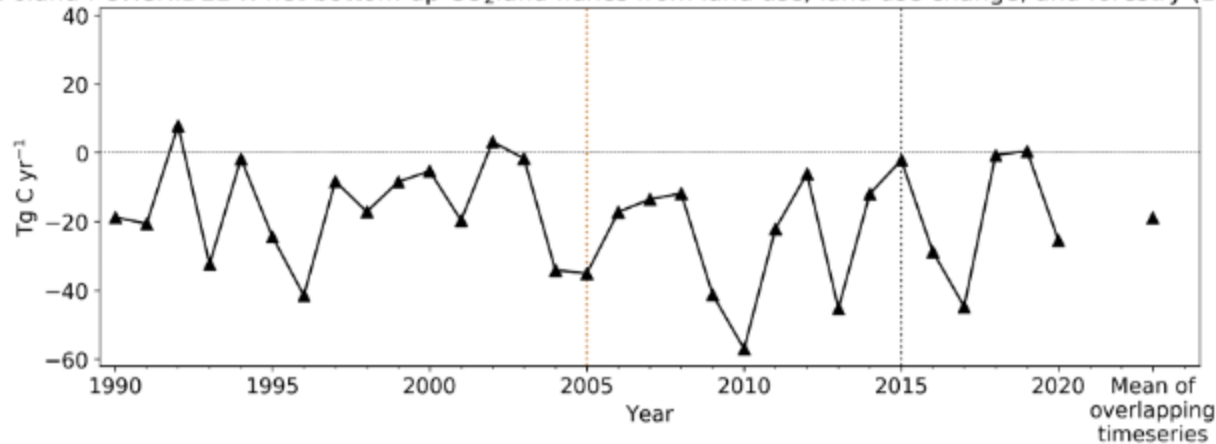


WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Factorial experiments

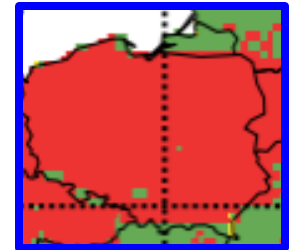
Poland : ORCHIDEE-N net bottom-up CO₂ land fluxes from land use, land use change, and forestry (LULUCF)



----- Kyoto Protocol (entering into force)

----- Paris Agreement

▲ TOTAL

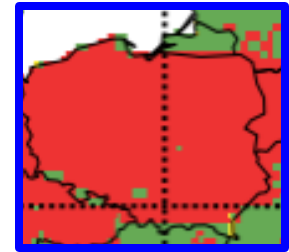
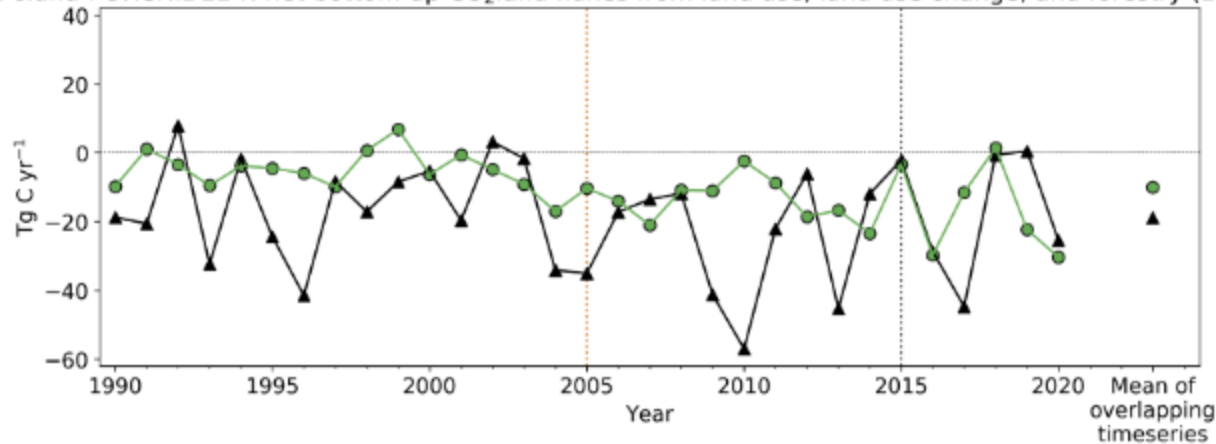


WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Factorial experiments

Poland : ORCHIDEE-N net bottom-up CO₂ land fluxes from land use, land use change, and forestry (LULUCF)

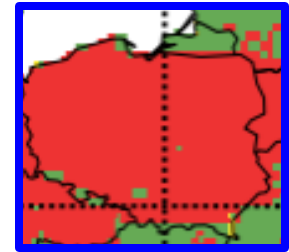
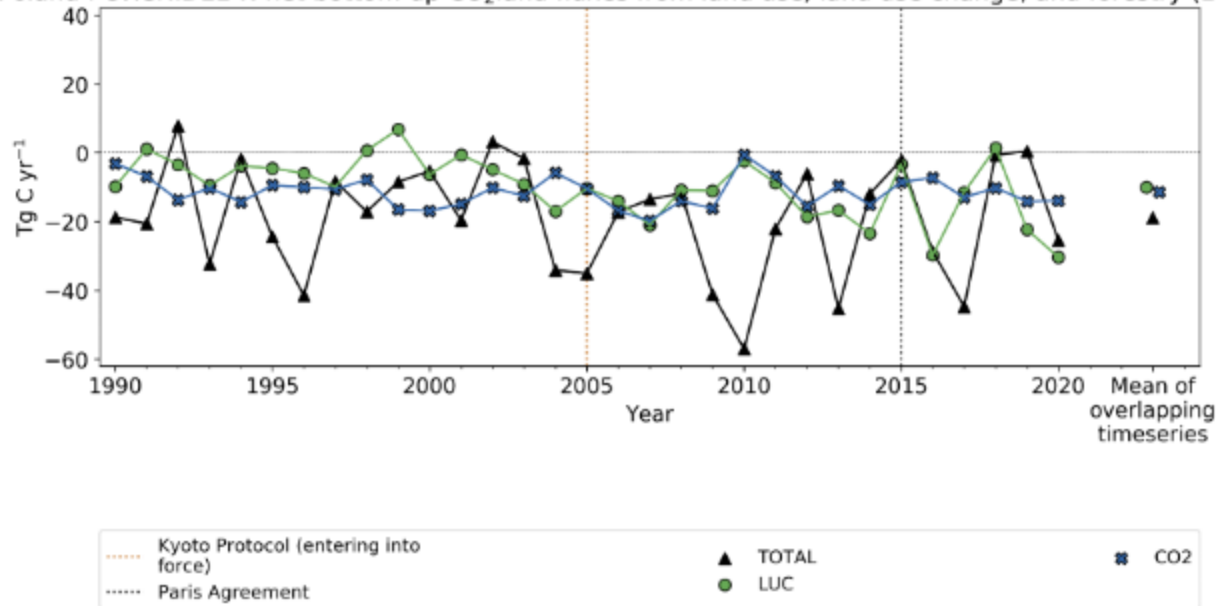


WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Factorial experiments

Poland : ORCHIDEE-N net bottom-up CO₂ land fluxes from land use, land use change, and forestry (LULUCF)

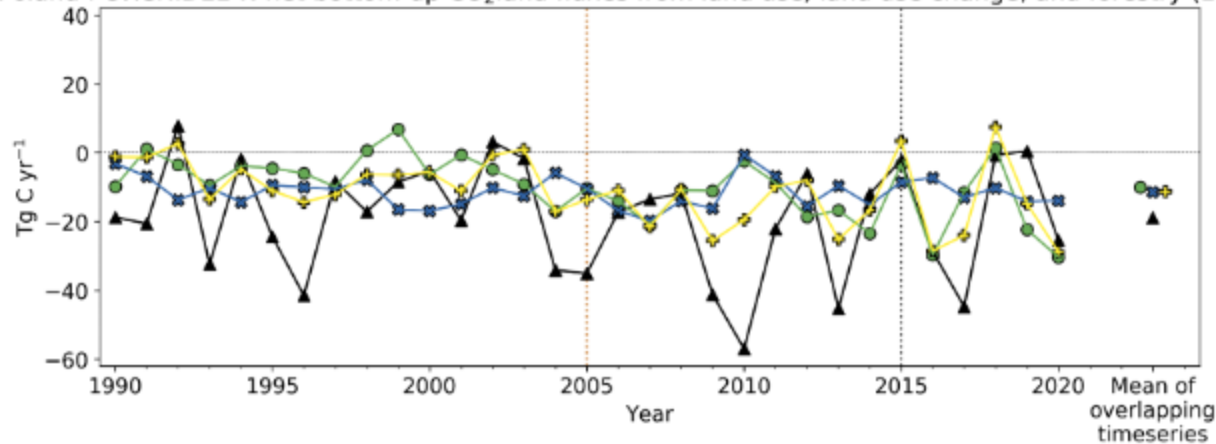


WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

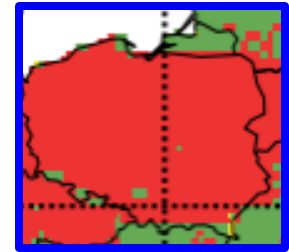
Factorial experiments

Poland : ORCHIDEE-N net bottom-up CO₂ land fluxes from land use, land use change, and forestry (LULUCF)



----- Kyoto Protocol (entering into force)
 Paris Agreement

▲ TOTAL
 ● LUC
 ■ CO2
 ◆ NITROGEN

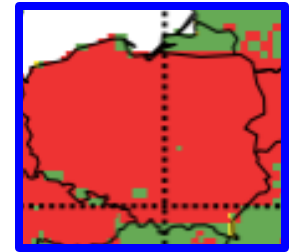
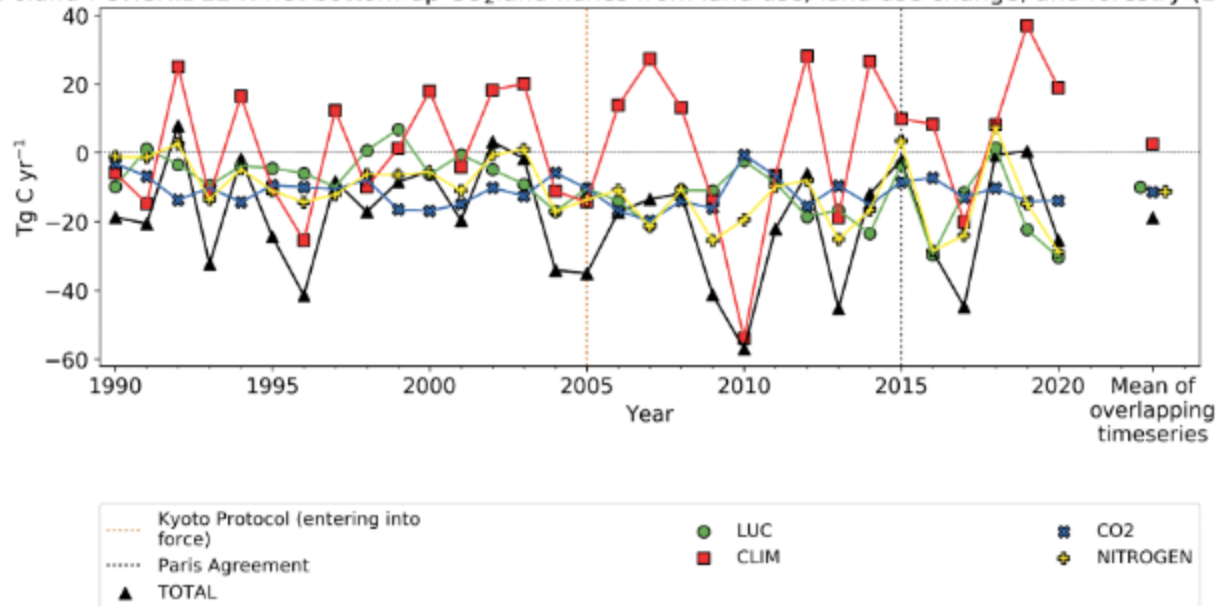


WP3 – NBP ATTRIBUTION

Dynamic global vegetation models (TRENDY)

Factorial experiments

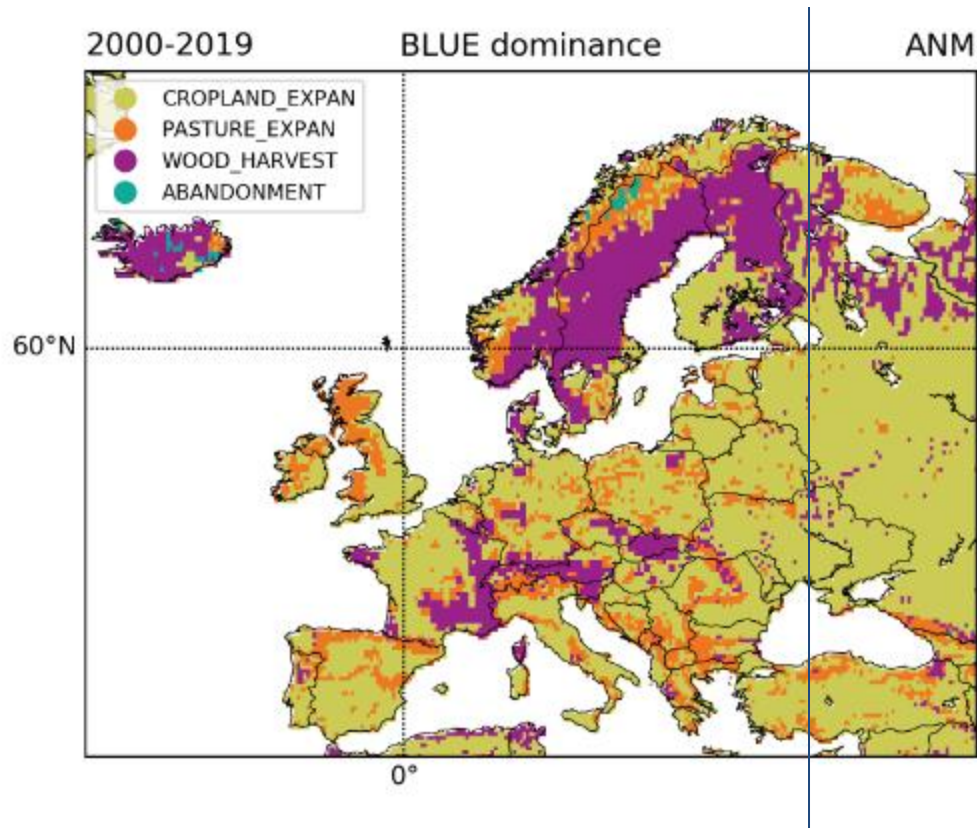
Poland : ORCHIDEE-N net bottom-up CO₂ land fluxes from land use, land use change, and forestry (LULUCF)



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

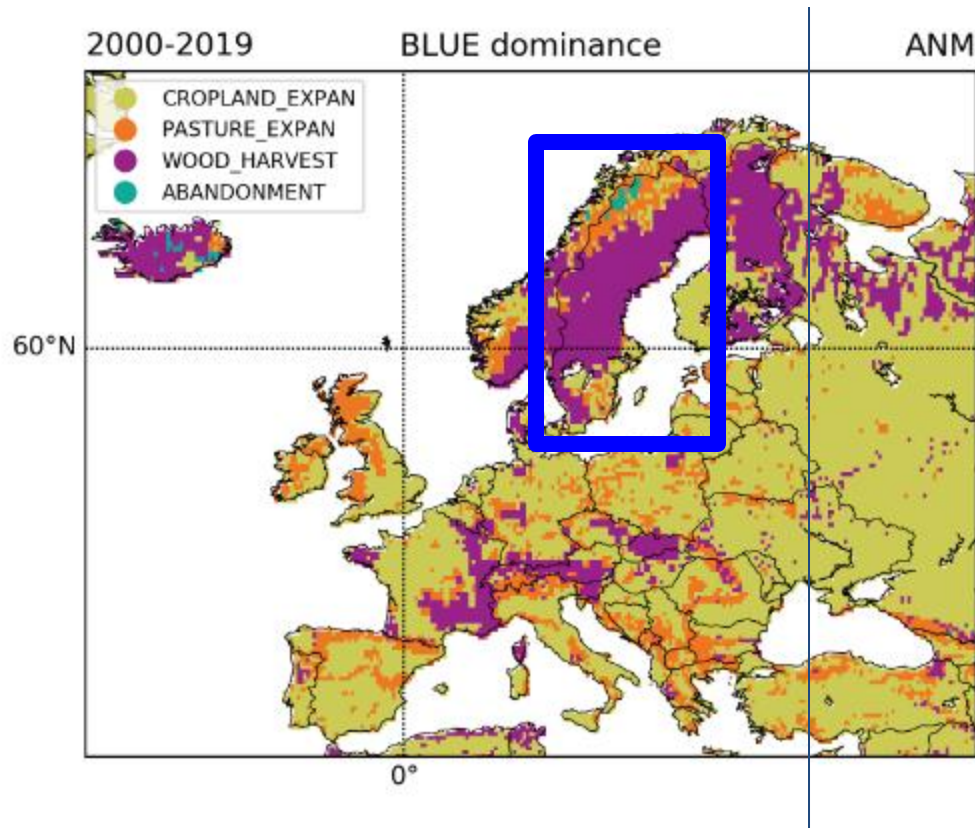
Emission components



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

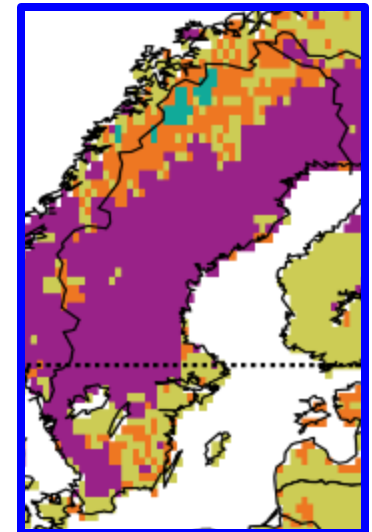
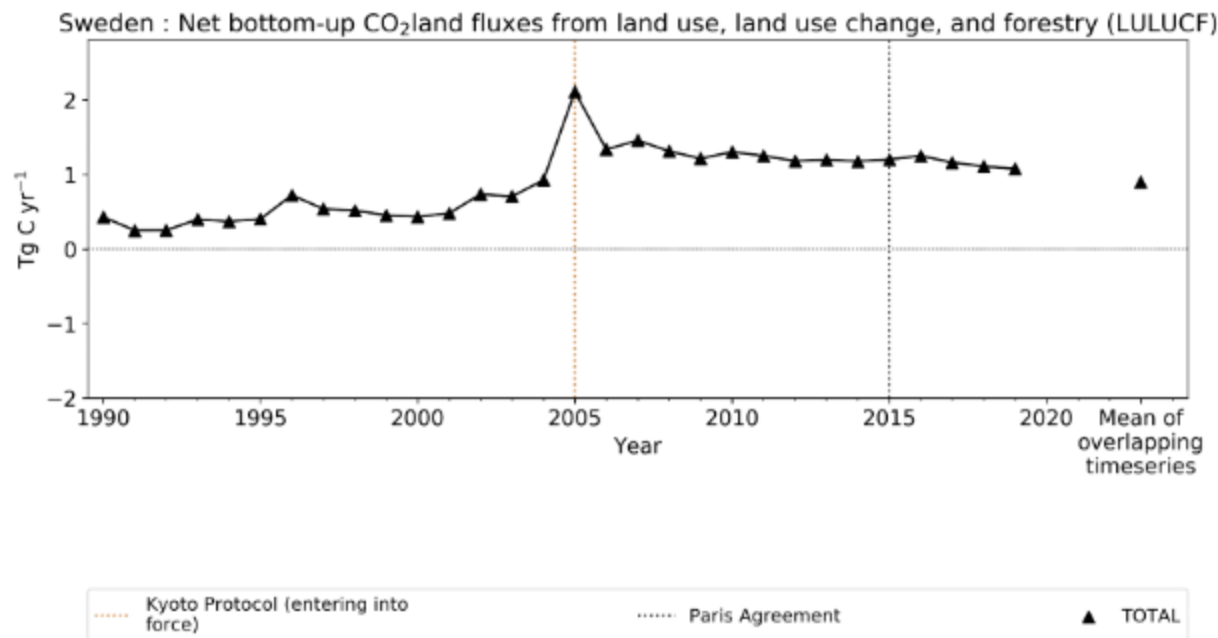
Emission components



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

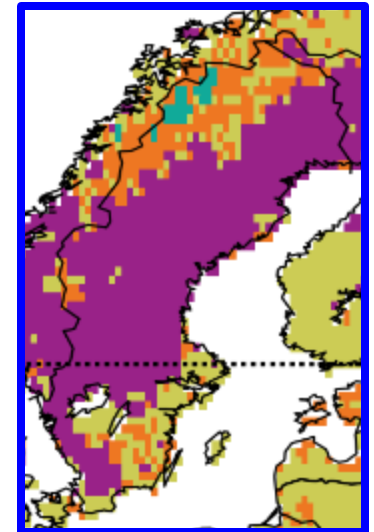
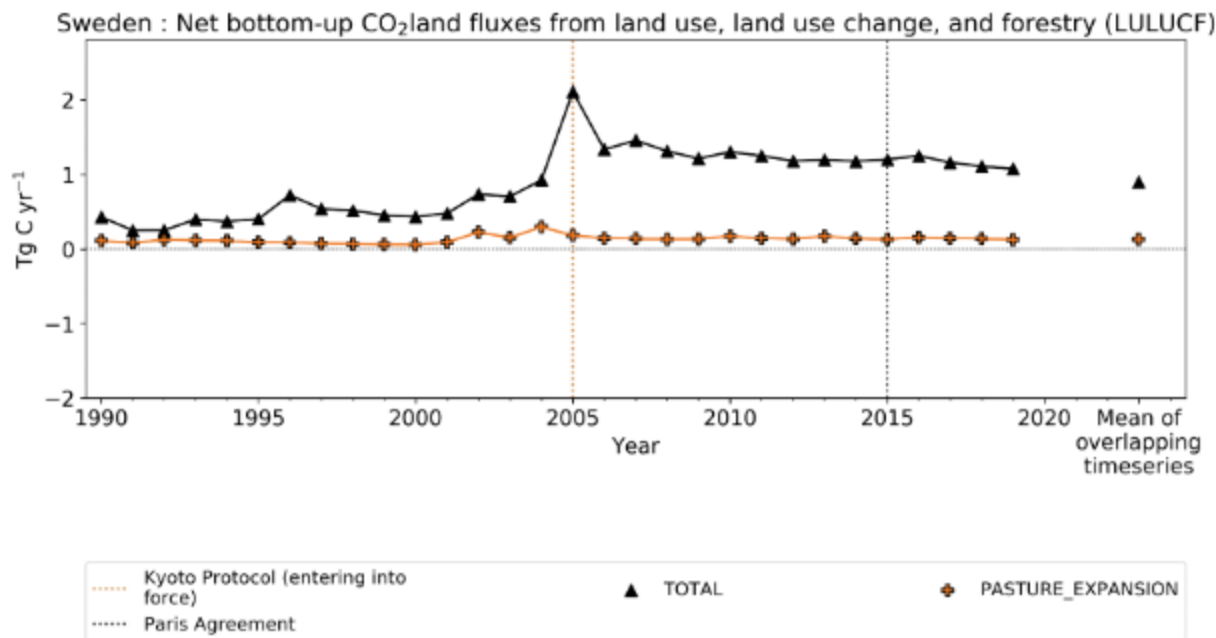
Emission components



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

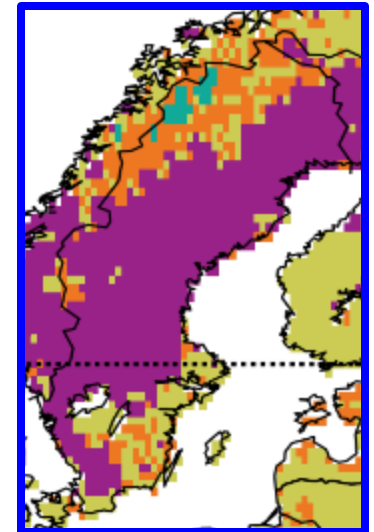
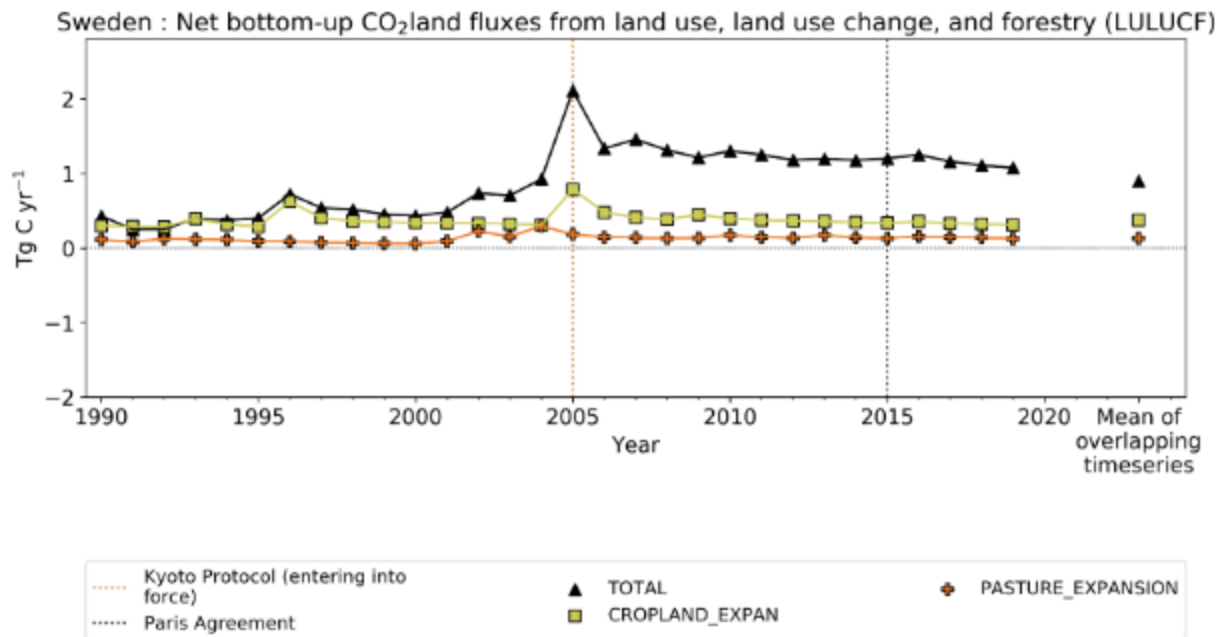
Emission components



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

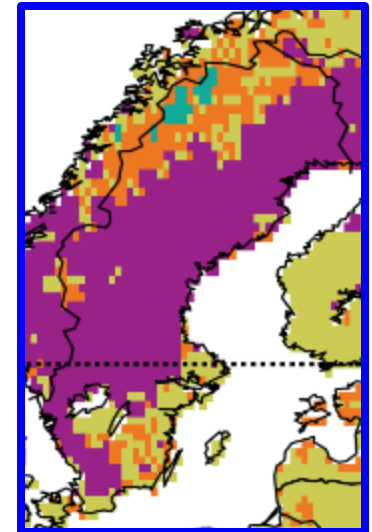
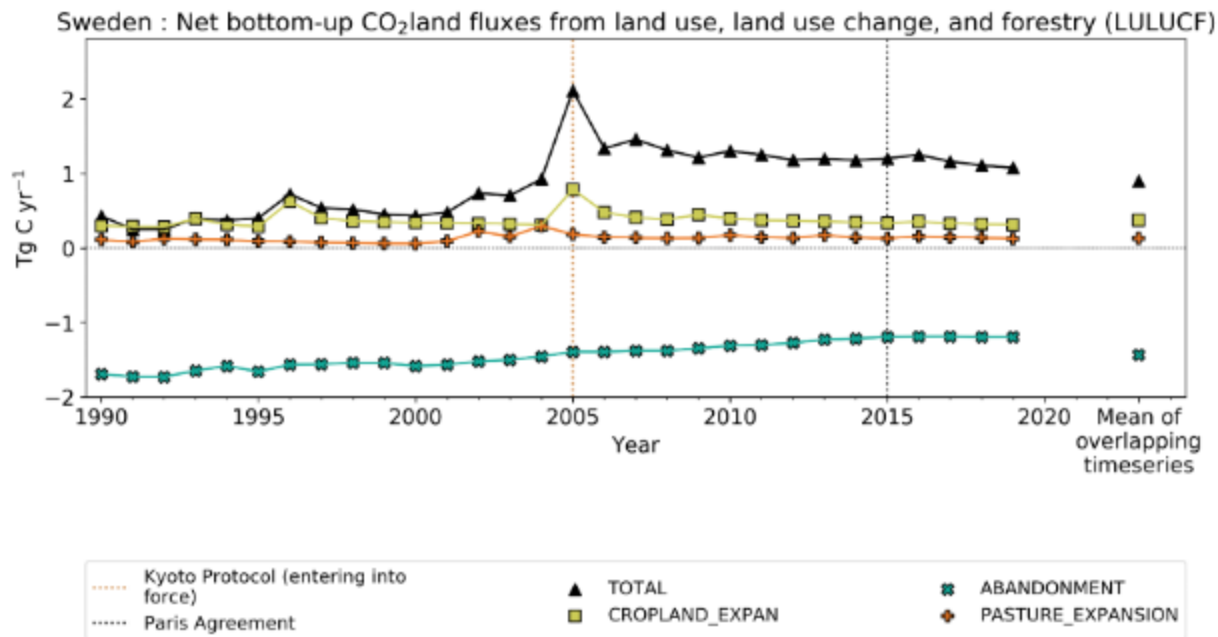
Emission components



WP3 – NBP ATTRIBUTION

Bookkeeping models (BLUE)

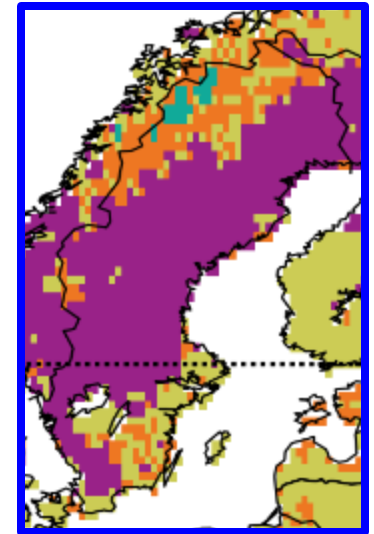
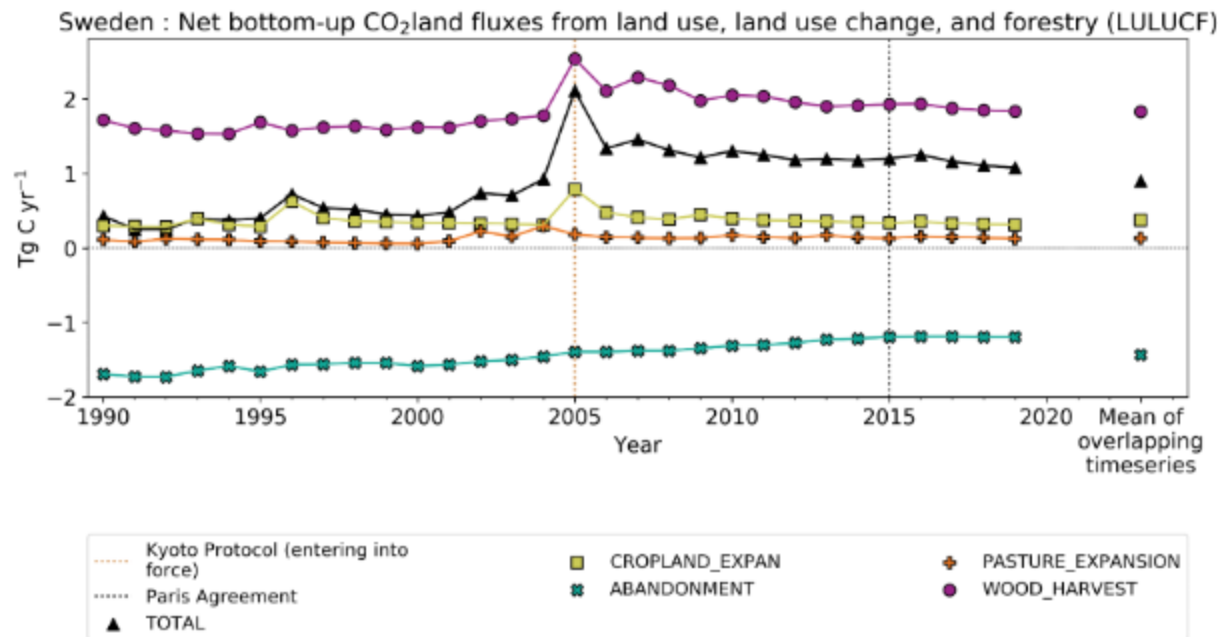
Emission components



WP3 – NBP ATTRIBUTION

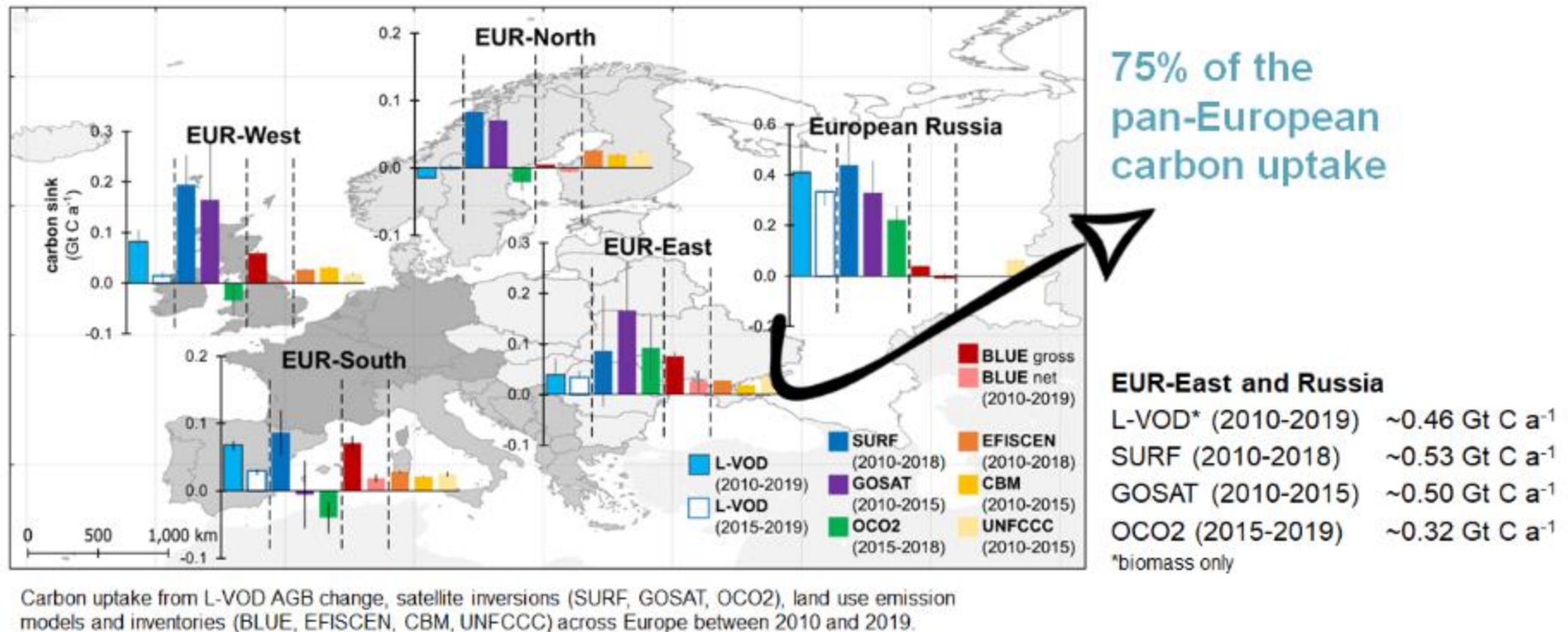
Bookkeeping models (BLUE)

Emission components



WP3 – EASTERN EUROPE SINK

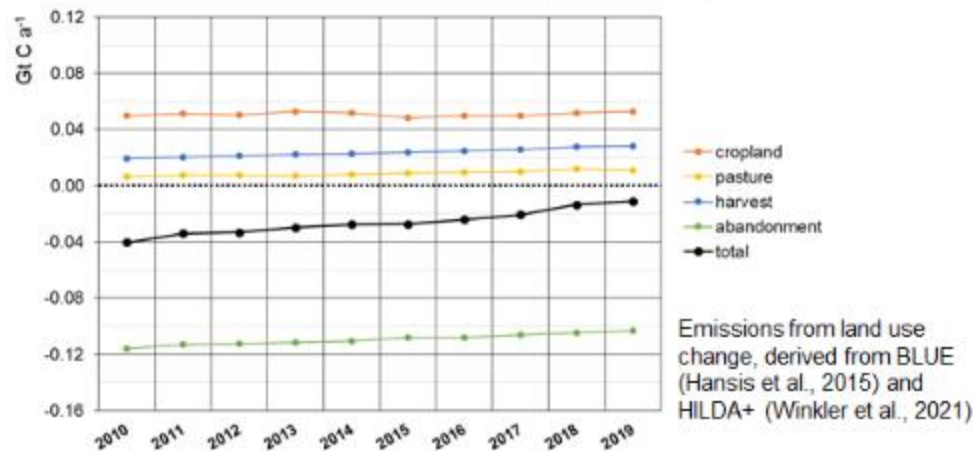
1. How large is the EE carbon sink?



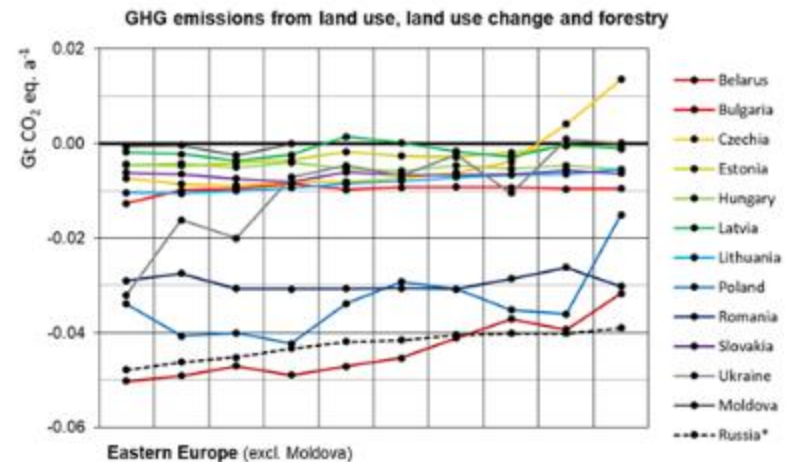
Winkler et al., in prep.

2. What are the temporal patterns?

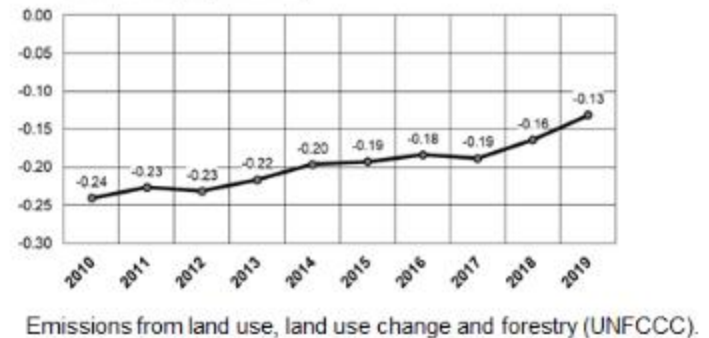
Carbon emissions from land use change (BLUE) in Eastern Europe



Decline of the land carbon sink



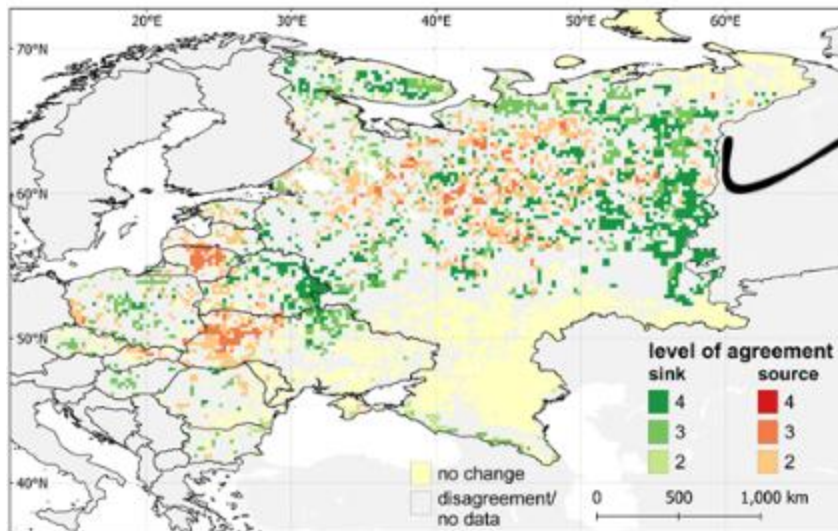
Eastern Europe (excl. Moldova)



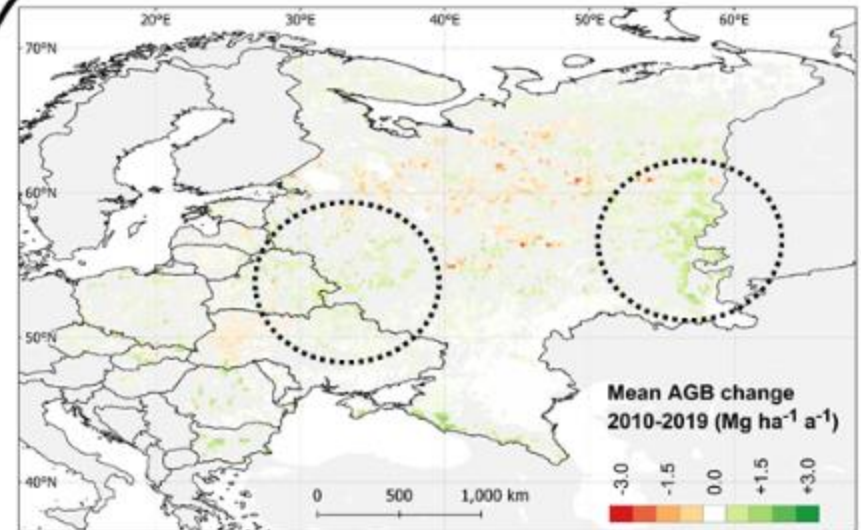
Winkler et al., in prep.

3. What are the spatial patterns?

Hot spot regions of carbon uptake



Agreement of datasets: Sources are defined by $\text{AGB} < -0.05 \text{ Mg C ha}^{-1} \text{ a}^{-1}$, sinks by $\text{AGB} > 0.05 \text{ Mg C ha}^{-1} \text{ a}^{-1}$.



Carbon gains and losses in AGB (in $\text{Mg C ha}^{-1} \text{ a}^{-1}$) in Eastern Europe during 2010-2019 from
a) TRENDY S3 (mean of 15 models), b) JPL: Xu et al. 2021, c) L-VOD and d) bias-adjusted WRI: Harris et al. 2021.

Winkler et al., in prep.

4. What are the drivers?

Land use/management

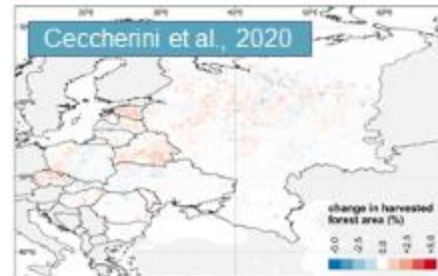
vs.

Climate/environment

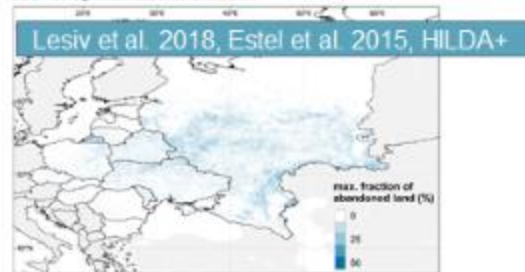
LUC: Agriculture, abandonment, harvest



LUC: Forest harvest



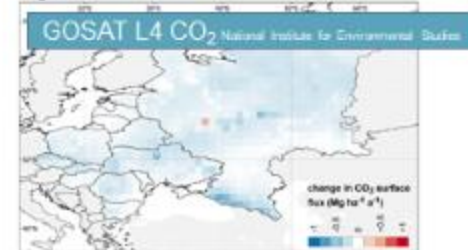
LUC: cropland abandonment



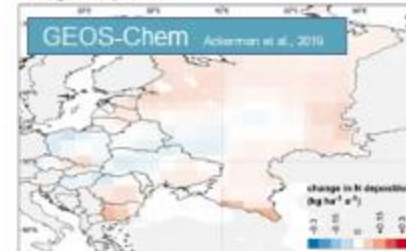
soil moisture



CO₂ flux



nitrogen deposition



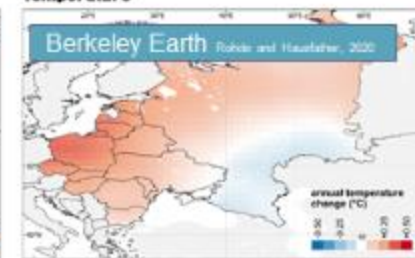
Fire



Precipitation



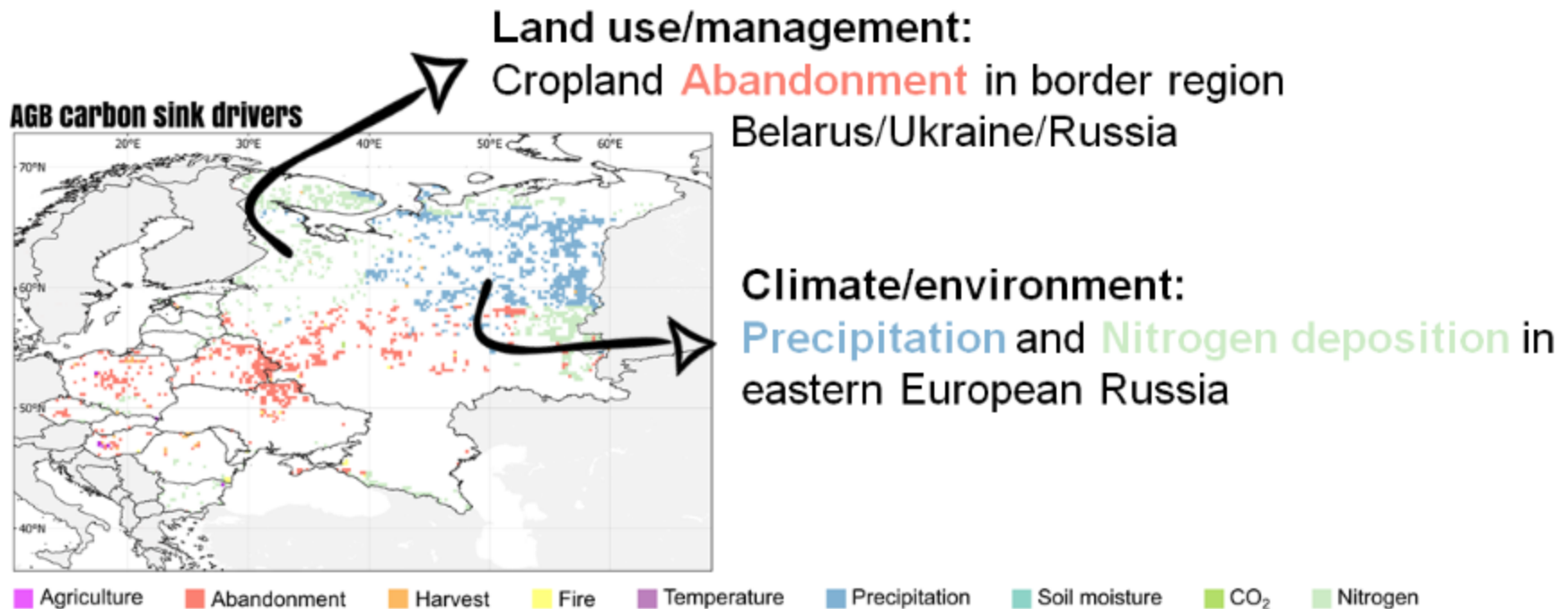
Temperature



Spatial trends of possible underlying drivers and influencing factors of AGB carbon change in Eastern Europe during 2010-2019.

Winkler et al., in prep.

4. What are the drivers?



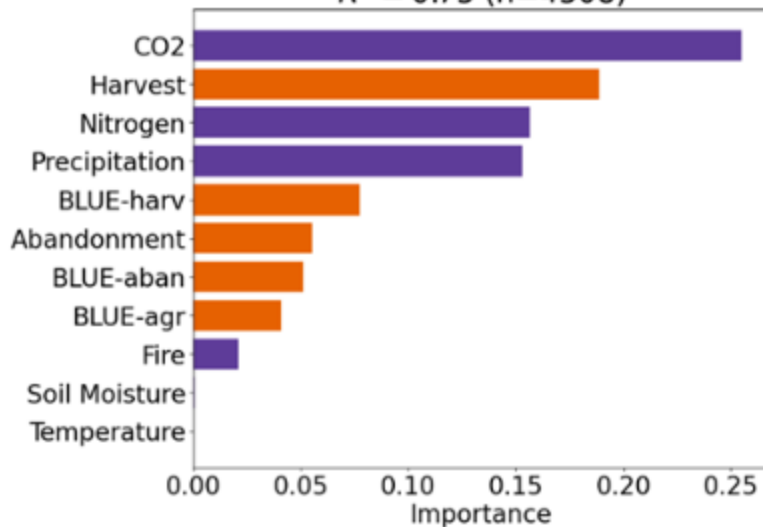
Spatial patterns of drivers of AGB carbon change in Eastern Europe during 2010-2019.

Winkler et al., in prep.

4. What are the drivers?

AGB carbon sink

$R^2 = 0.75$ (n=4508)



Land use/management

Environment

Relative feature importance of driver variables for AGB change across Eastern Europe (Random Forest regression)

Driver analysis based on Random Forest regression

- ❑ Climate factors, CO2 fertilization and N deposition as most important drivers
- ❑ Land use/management, wood harvest as cause of the decreasing land carbon sink?

Take-away

- ❑ Eastern Europe: $\sim 0.46 \text{ Gt C a}^{-1} \rightarrow 75\%$ of the European carbon uptake
- ❑ Decline of the carbon sink 2010-2019
- ❑ Hot spot regions Russian Ural region and ~border Belarus/Ukraine/Russia



Driver analysis

- ❑ Land use change (abandonment) in hot spot region
- ❑ Climate change (CO_2 fertilization, N deposition, precipitation) in European Russia
- ❑ Forest management (harvest) as reason for the declining sink?

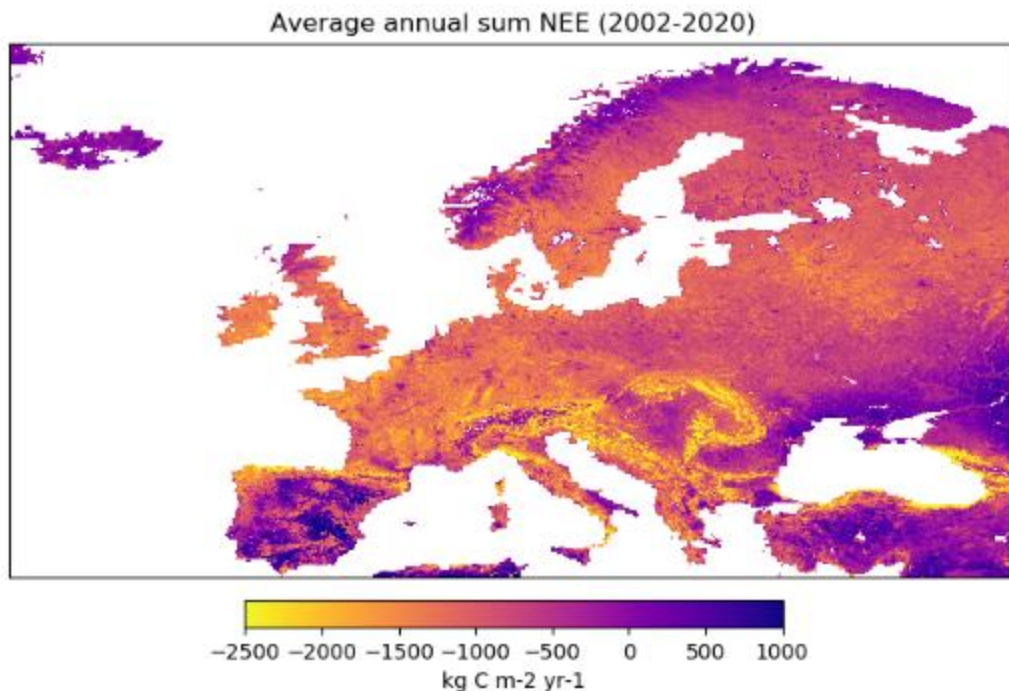


Vladimir Evgenievich Pankov / <https://pixlloguides.com/en.php?g=464797&p=3395702>

WP3 : T3.4 - ADDITIONAL PRODUCTS

⇒ More data were produced within WP3

- FLUXCOM (data-driven flux estimates): 3-hr ; ~ 5 km



- Not used yet in the CO₂ synthesis because of too large NEE !
- But recent progresses reveal a bias partly linked to shortwave radiation forcing !

- Carbon Cycle Data Assimilation Systems
(Fusion of process-based models and observations)

T3.4 Carbon Cycle Data Assimilation Systems

BETHY-CCDAS

Assimilation of

- Satellite soil moisture
- Satellite L-VOD
- In situ atm. CO₂ data
- Nightlights (for FF model)

Two-step assimilation

- Fossil Fuel at 0.1 in FFDAS
- Biogenic fluxes at 0.25 in CCDAS

Optimisation of

around 70 parameters in CCDAS and 1.5M in FFDAS

ORCHIDEE-CCDAS

Assimilation of

- FluxNet in situ data
- Satellite Fluorescence
- In situ atm. CO₂ data (using LMDZ model)

Optimisation of

- around 150 parameters
- stepwise assimilation of each datastream

CTDAS

Dynamic a-priori fluxes

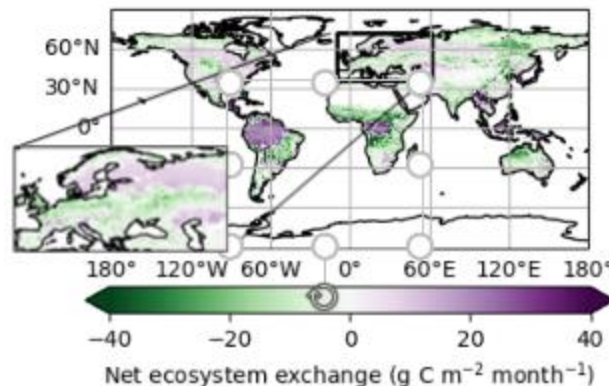
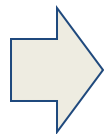
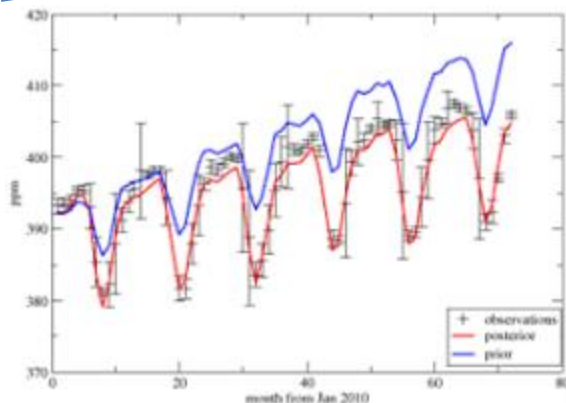
Near real-time statistical data (EU, Eurostat,...) and weather data to fill in short-term variations in fluxes at ~2km

Assimilation of

- ICOS CO₂ mole fractions
- $\Delta^{14}\text{C}$, CO, NO₂

Optimisation of

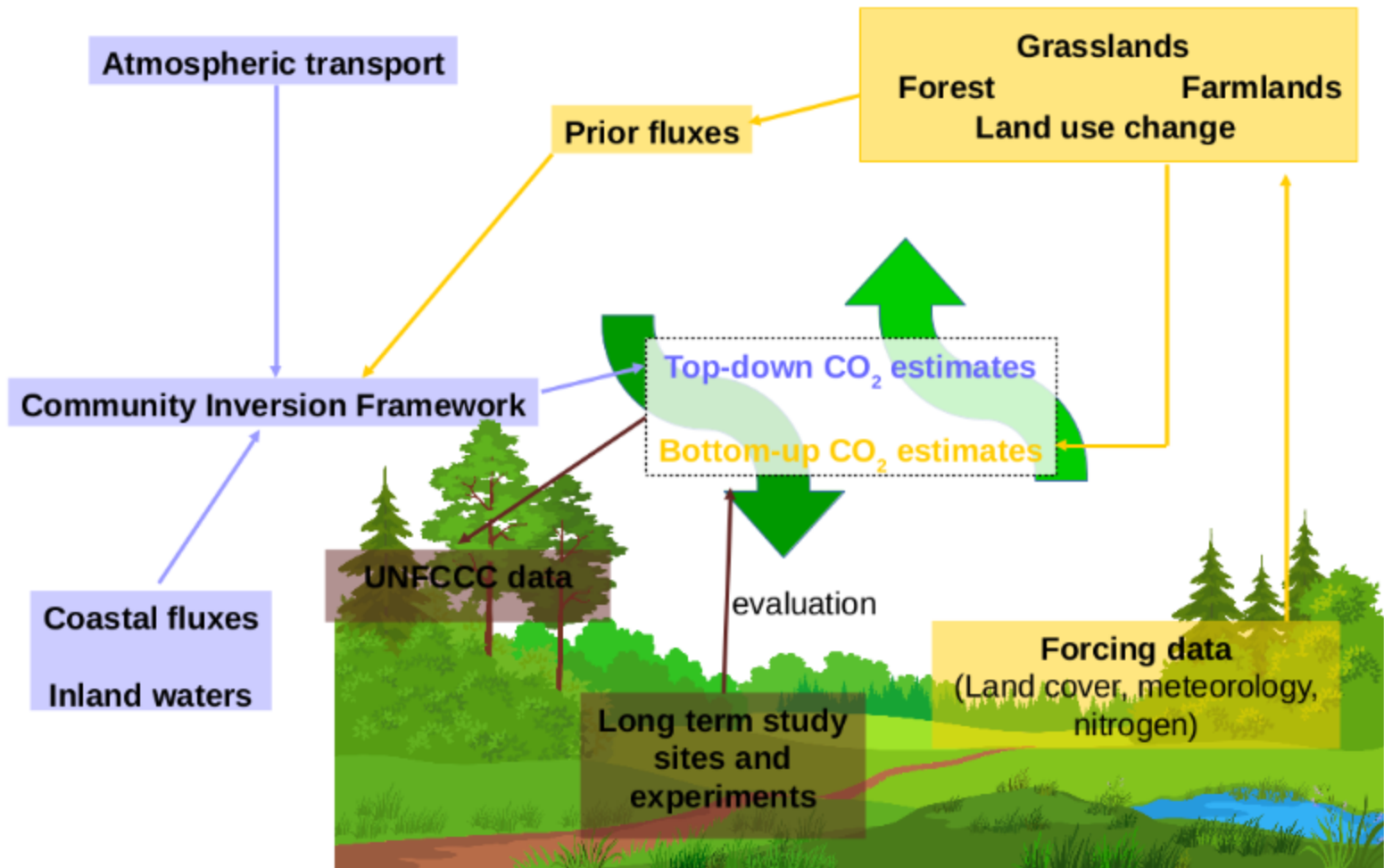
~10 params per country, sectorial FF emissions, NEE / PFT



⇒ see D2.13

WP3 “CO₂ land Pre-operational system”

Pre-operational system for CO₂ fluxes from terrestrial ecosystems





WP3 – STATUS OF LAST DELIVERABLES

D3.7	Attribution analysis	CEA	Draft on-going
D3.14	National forest inventory and high resolution forest cover for eastern Europe	WEnr	Final version ready (proof reading phase)
D3.16	Analysis of NEE and carbon balance of Eastern Europe	CEA	Draft done based on a paper
D3.17	Final version of pre-operational system for terrestrial CO2 verification	UNIABD	Draft on-going



Thank you for your attention.



This project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement No 776810

WP3 PARTNERS

Two co – leaders:

University of Aberdeen (**UNIABDN**),
Commissariat à l'énergie atomique (**CEA**),

18 partners:

Joint Research Centre (**JRC**), Karlsruhe Institute of Technology (**KIT**),
Max Planck Society for the Advancement of Science (**MPG**),
Norwegian Institute for Air Research (**NILU**),
International Institute for Applied Systems Analysis (**IIASA**),
Integrated Carbon Observation System (**ICOS**) ERIC,
European Centre for Medium-Range Weather Forecasts (**ECMWF**),
Wageningen Environmental Research (**WEnR**),
University of Bremen (**UBremen**), University of East Anglia (**UEA**),
Vrije Universiteit Amsterdam (**VU**), Lund University (**ULUND**),
University of Bergen (**UiB**), Wageningen University & Research (**WUR**),
Université libre de Bruxelles (**ULB**), Saint Petersburg State University (**SPbU**),
Ural Federal University (**UrFU**), Ludwig-Maximilian Munich University (**LMU**)



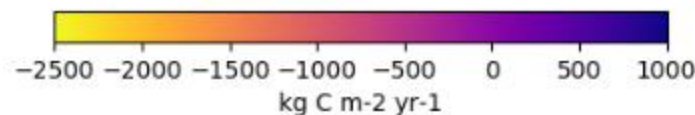
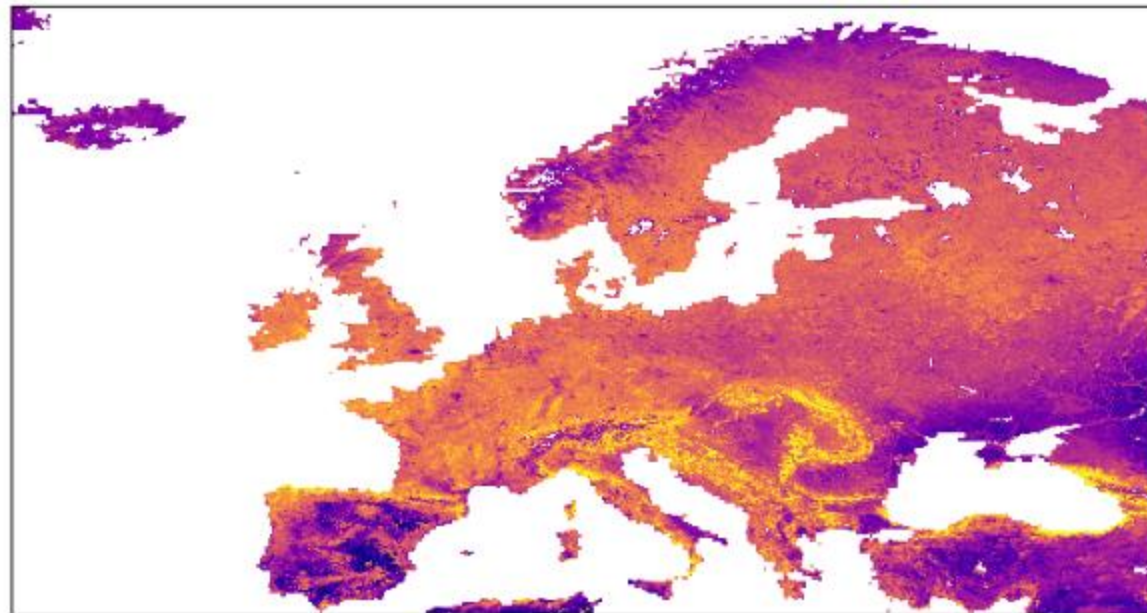
Additional slides



WP3 – BOTTOM-UP DATA-DRIVEN BIOGENIC FLUXES

New generation Fluxcom:
upscaling of eddy-covariance measurements using
Earth observation and machine learning

Average annual sum NEE (2002-2020)

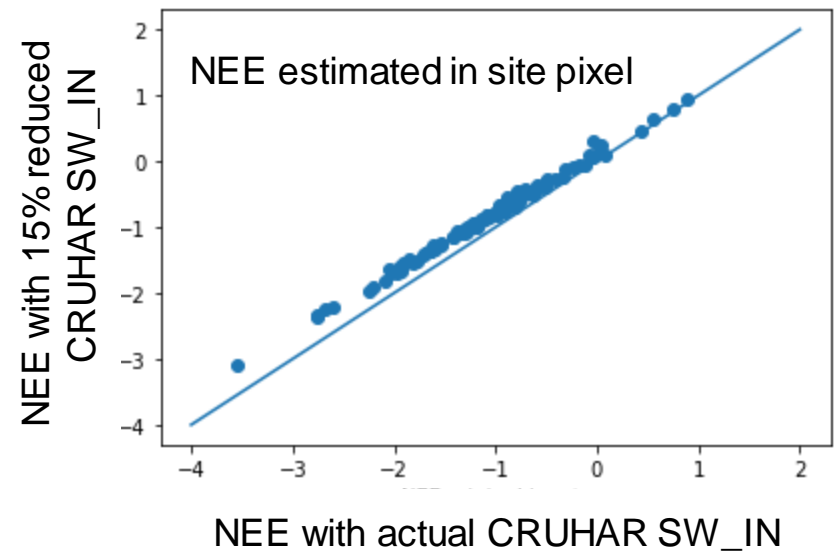
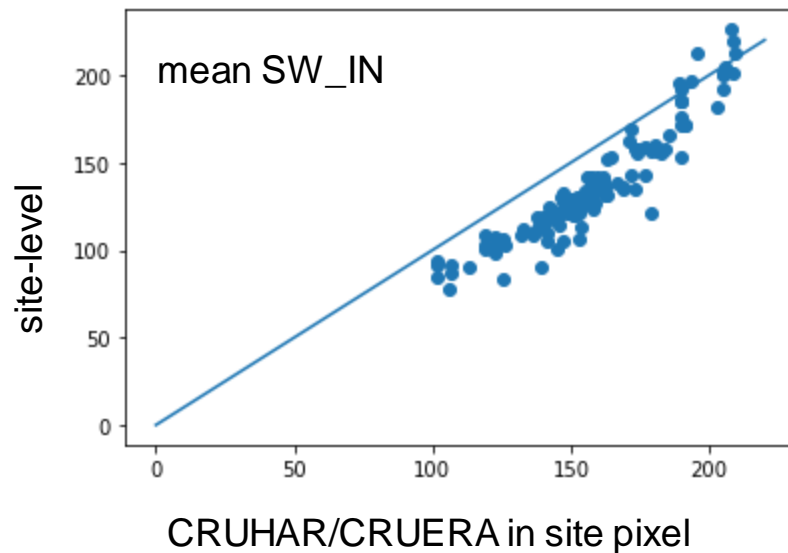


European flux
estimates every
3 hours, 0.05deg



WP3 – BOTTOM-UP DATA-DRIVEN BIOGENIC FLUXES

The importance of meteorological fields:
very strong sink in Fluxcom NEE partly related to bias
in shortwave incoming radiation:



15% average bias between
site-level and gridded incoming
radiation

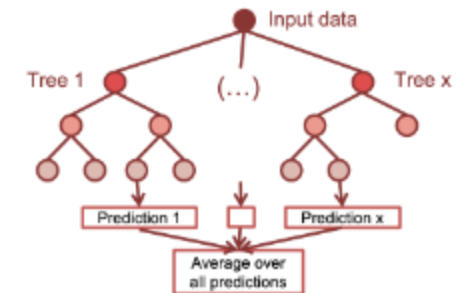


21% biased NEE on average

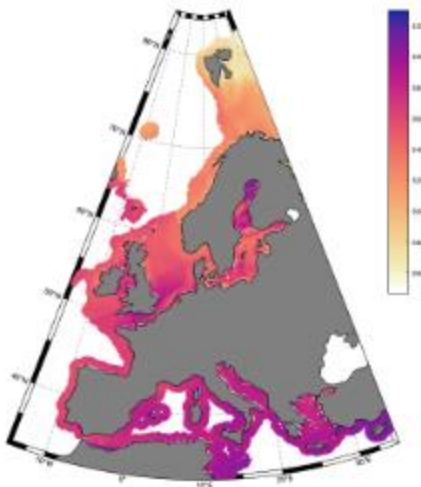
**Meike Becker, Are Olsen,
University of Bergen**

Annual updated coastal CO₂ flux maps on the European shelf (1998-2020):

Fitting a set of driver data (e.g. temperature, chlorophyll concentration, mixed layer depth, ice concentration) against surface ocean *p*CO₂ observations



*p*CO₂ / μ atm (average 1998-2020)



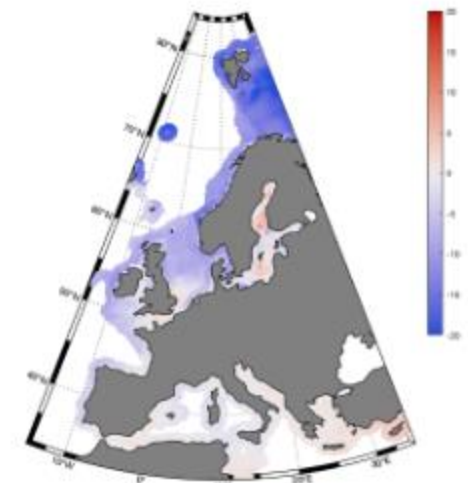
❖ Sinks for CO₂:

- Barents Sea
- Nordic Seas
- Northern and Central North Sea
- Atlantic shelf

❖ Sources for CO₂:

- Southern North Sea and English Channel
- Baltic Sea
- Mediterranean

Air-Sea CO₂ Flux / gC m⁻² yr⁻¹



2010-2020