

# Impact of Heat Wave Episodes in Summer 2019 on the Carbon Flux

inferred through modelling from ICOS Ecosystem stations in France

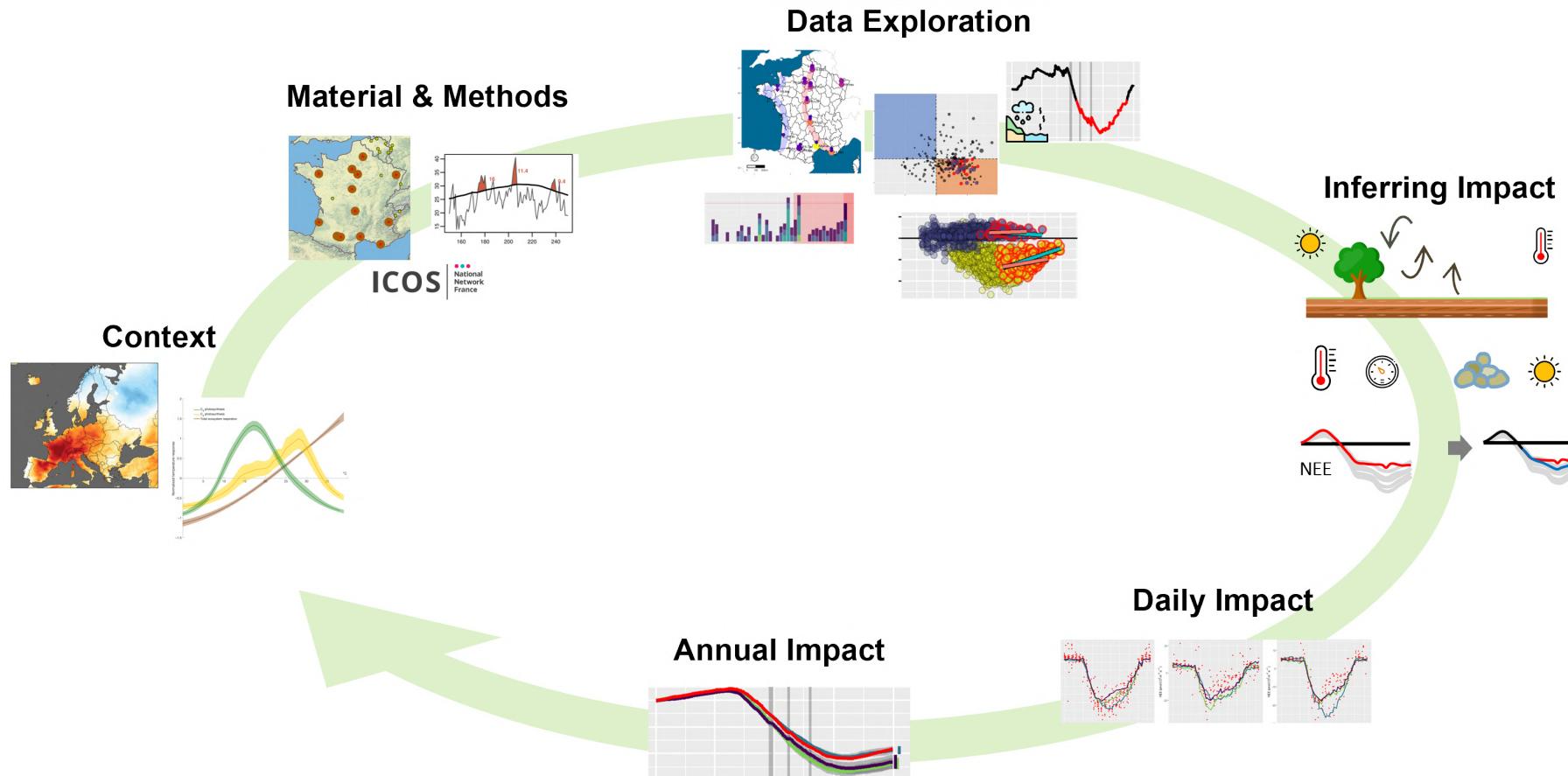
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Supervised by P. Buysse, B. Loubet

Special thanks to G. Simioni, S. Lafont, D. Berveiller, J. Ruffault

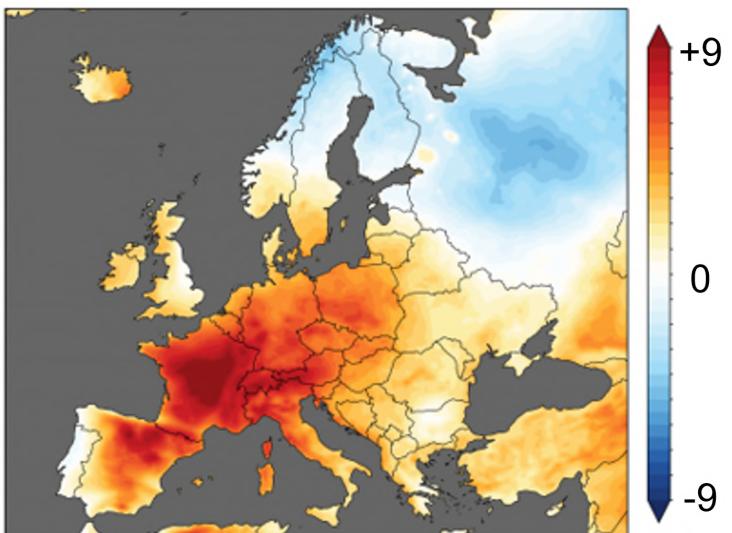
# Outline



# Context

## 2019 Summer Heat Waves in France

Temperature Anomaly (25-29 June 2019)



Anomalies up to +9°C in France.

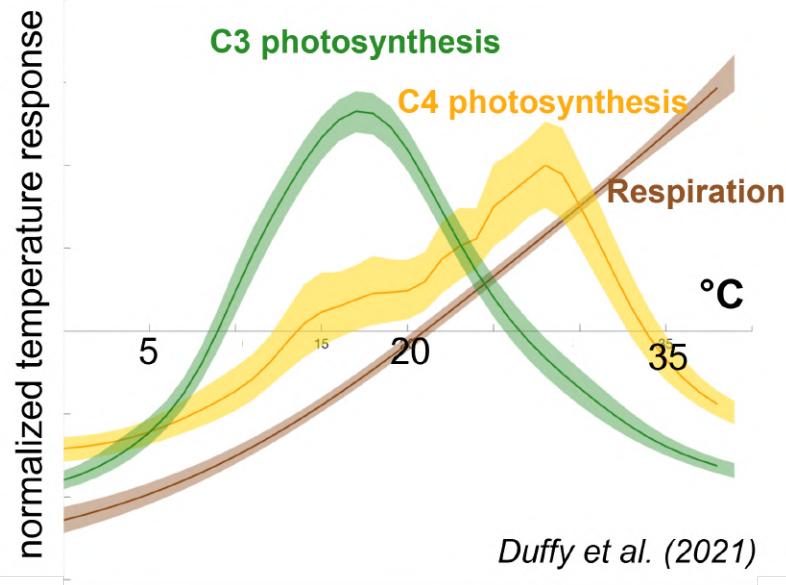
In central France, equivalent to 2003,  
when summer accounted for 70,000 additional deaths in Europe.  
(Robine et al., 2008)

In 2019 again, absolute and local temperature records.



# Context

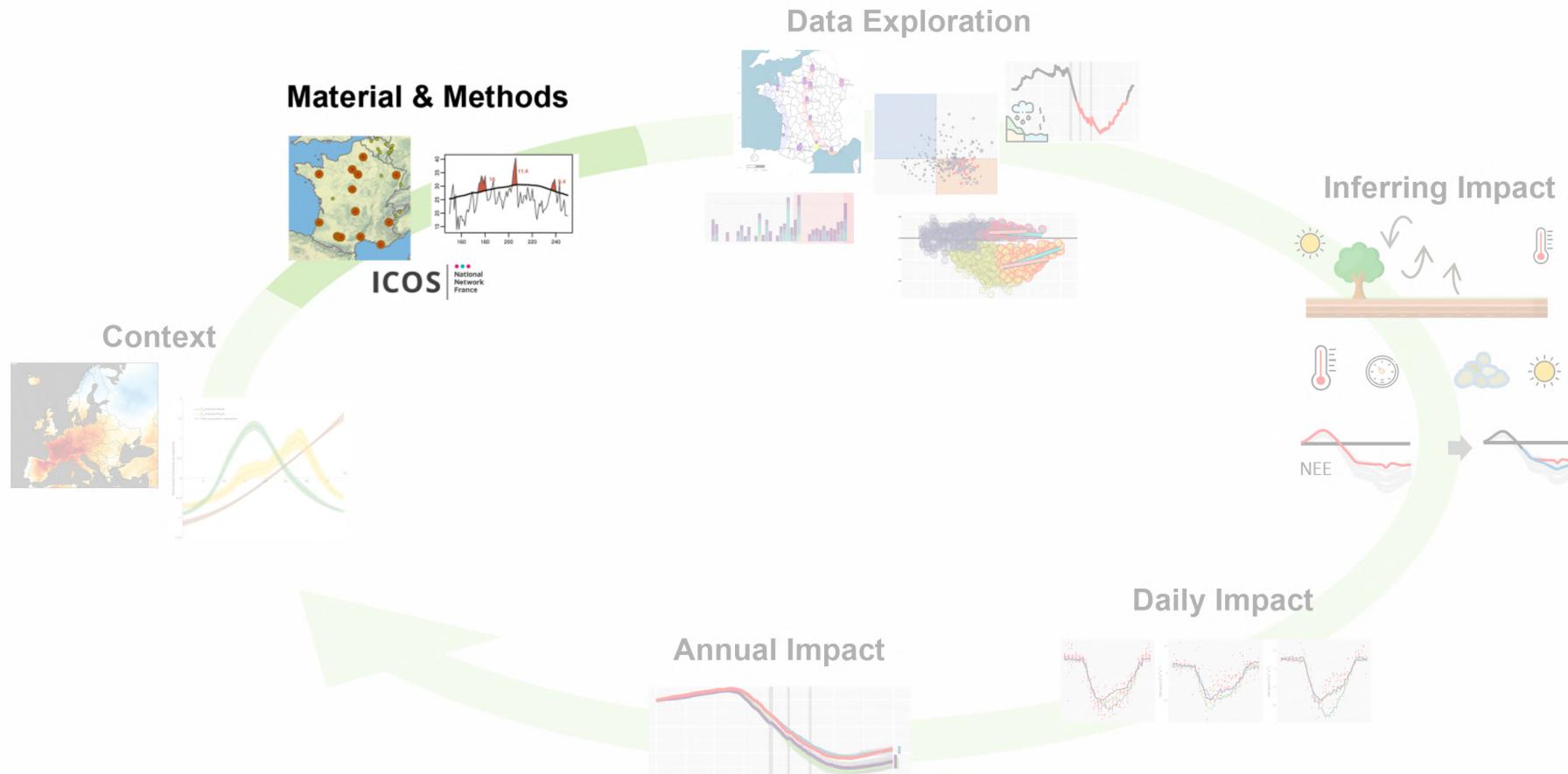
## Ecosystem Response to Temperature



- Land carbon sink strength depends on temperature. (Duffy et al., 2021)
- Extreme events are likely ↑ intense and ↑ frequent in the future. (IPCC, 2013)
- Uncertainty on land sink as carbon regulator. (Duffy et al., 2021)

Scientific questions: (1) Do heat waves decrease ecosystems' carbon sequestration capacity? (2) Does the ecosystems kept sequestering less carbon even after heat waves ceased?

# Material and Methods



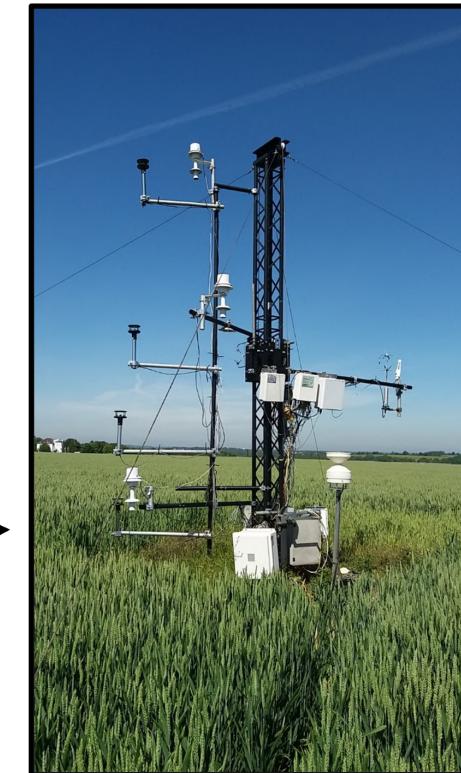
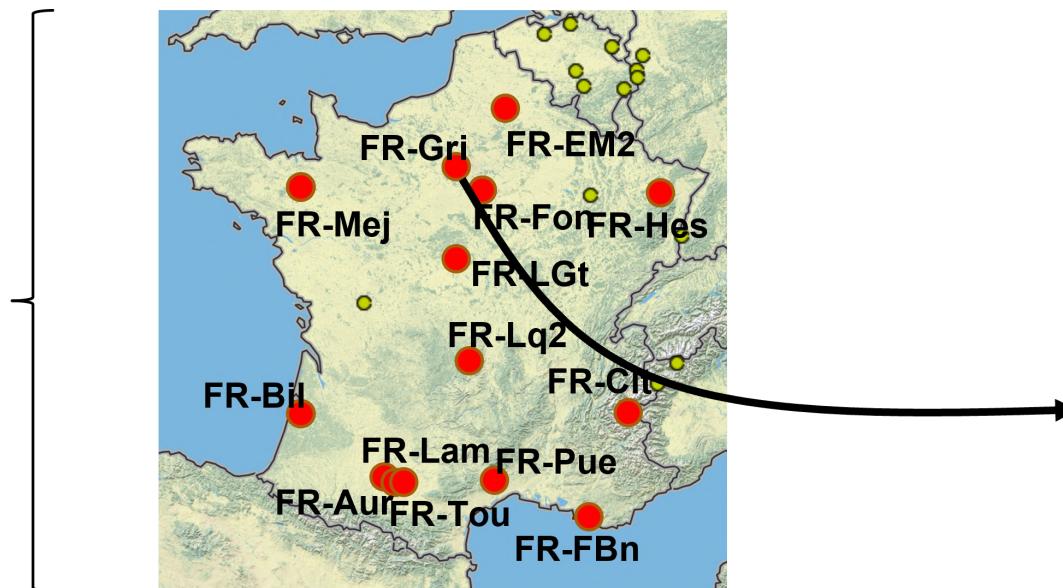
# Material and Methods

## Observation Sites

**ICOS** | National Network France

Data from 13 sites

- Forests (5)
- Cropland (5)
- Grassland (2)
- Peatland (1)



# Material and Methods

## Observation Sites



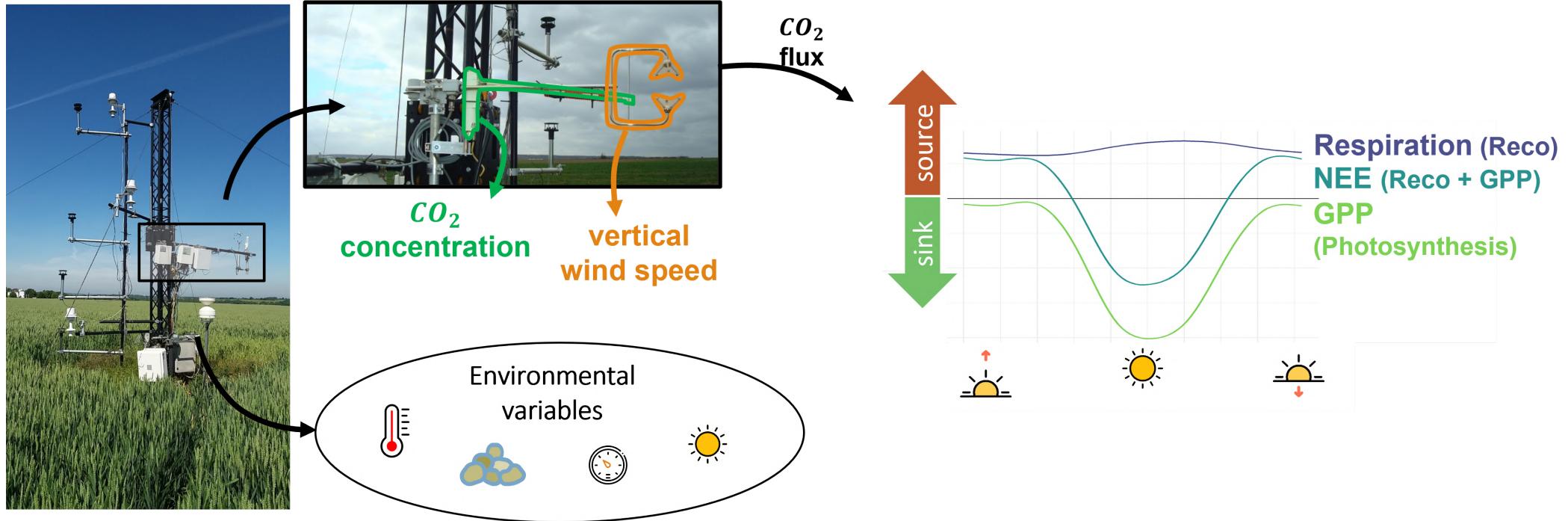
- 5 forest sites ○
- 5 crop sites ○
- 2 grassland sites ○
- 1 peatland site ○



<https://www.icos-cp.eu/>

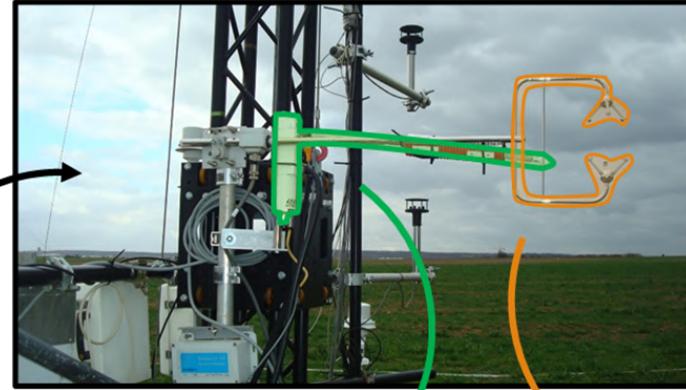
# Material and Methods

## Data Acquisition

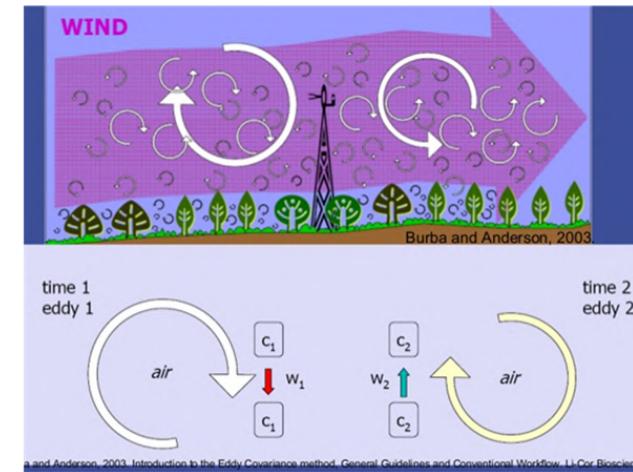
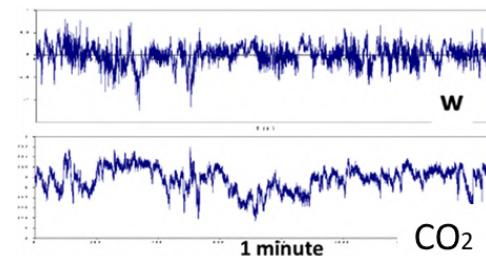


# Material and Methods

## Eddy Covariance



Very high  
acquisition rate  
(10 or 20Hz)



eddy-covariance  
method

# Data Handling

## from 20 Hz data to Gap filling



### Steps:

#### 1. Measurement (20Hz)

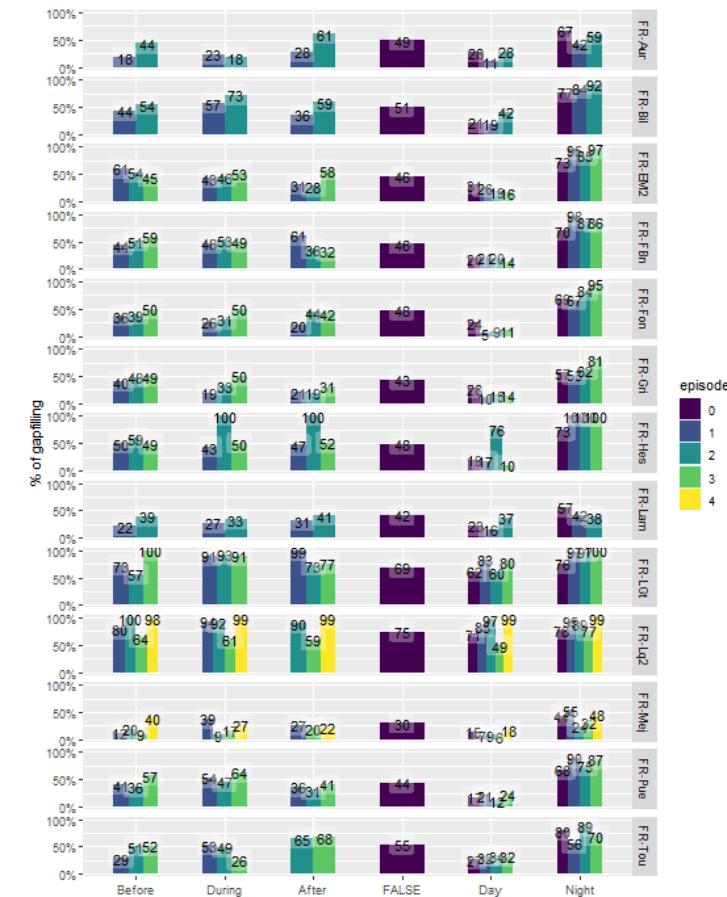
- Infrared gas analyser.
- 3D sonic anemometer.
- ...

#### 2. Datalogger

Sync data from instruments.

#### 3. Processing

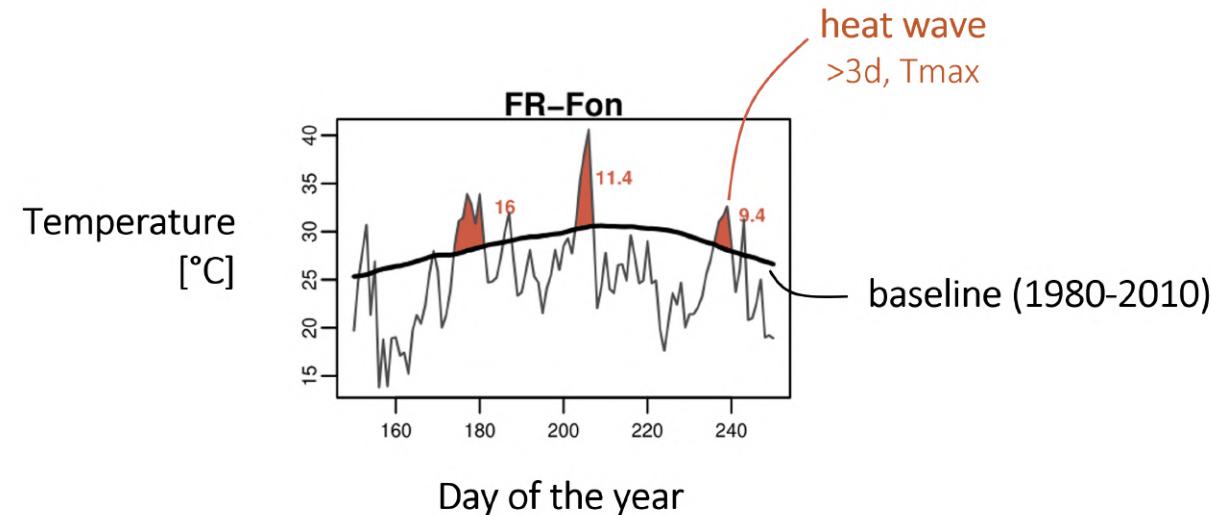
- Corrections.
- Calculating flux by eddy-covariance method.
- Gap filling (fig. →).
- Partitioning.



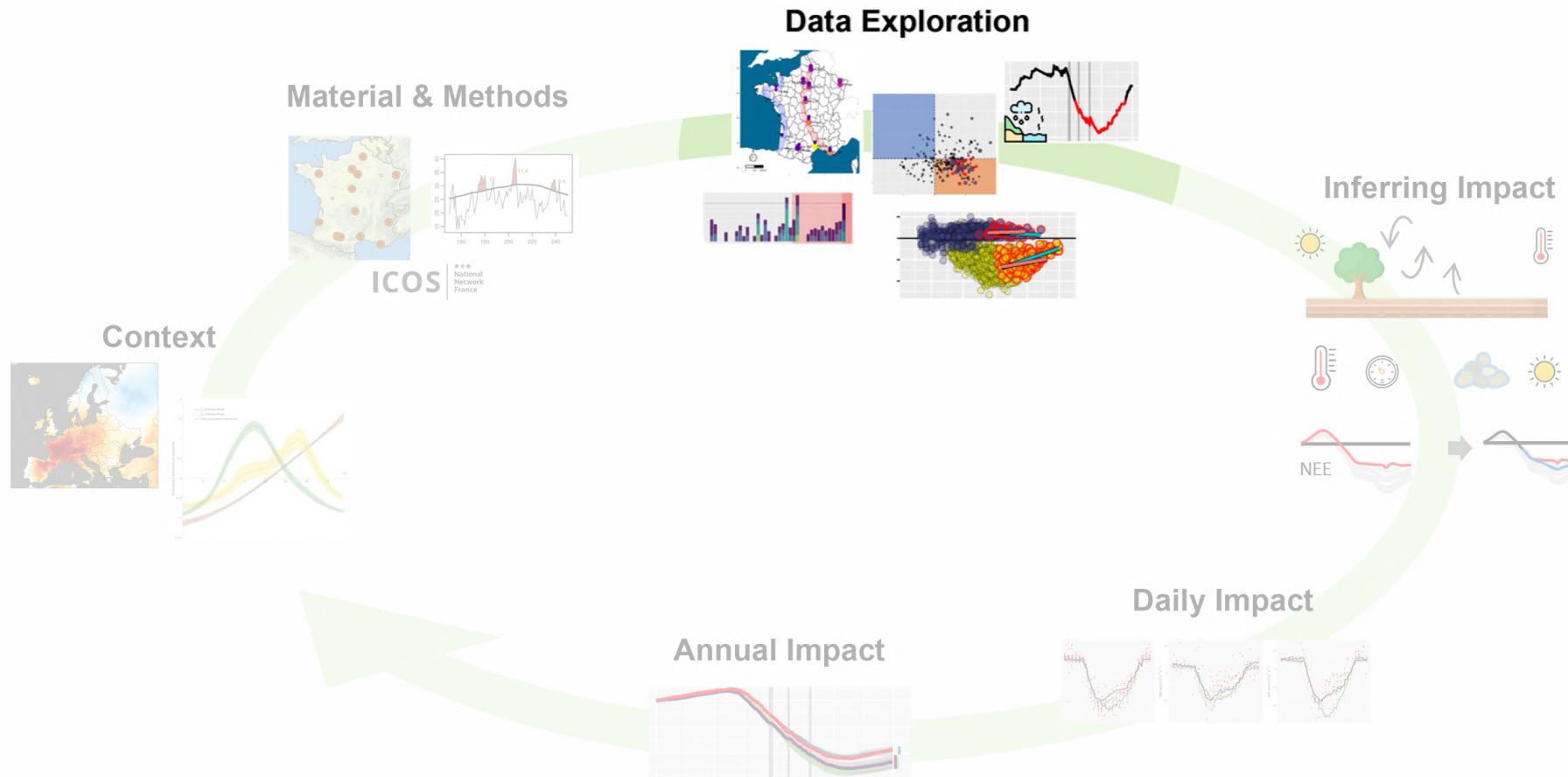
# Material and Methods

## Identifying Heat Waves

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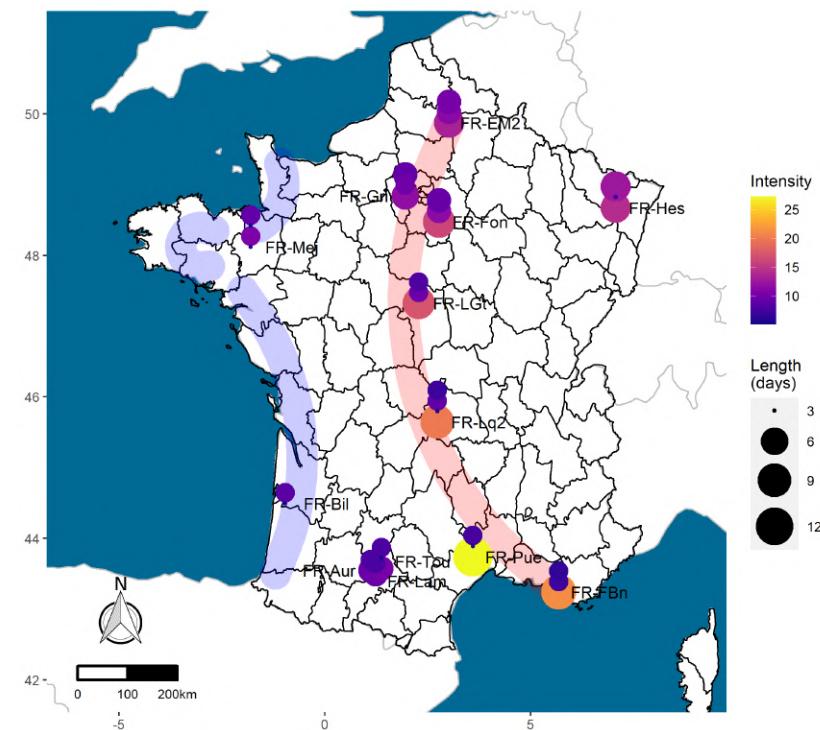
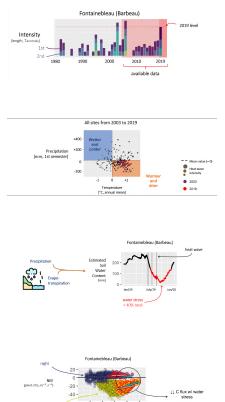


# Data Exploration



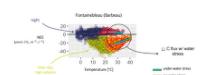
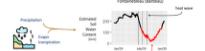
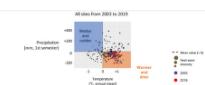
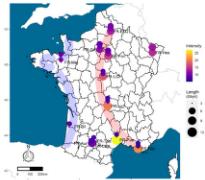
# Data Exploration

## Map of 2019 Heat Waves



# Data Exploration

## Historic of Heat Waves

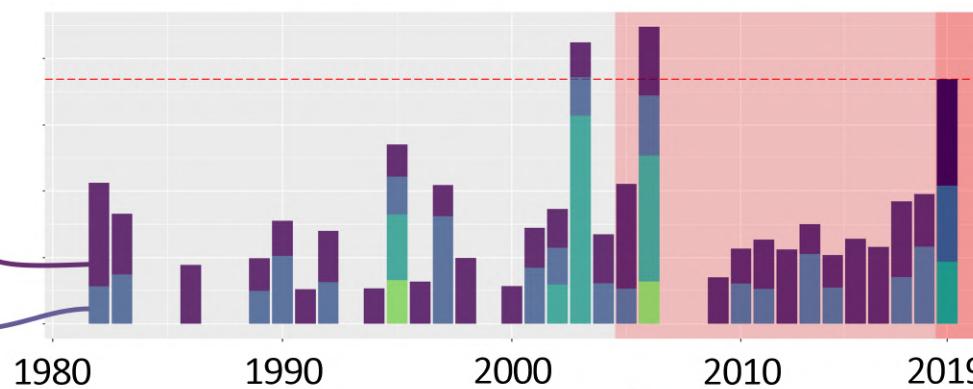


Fontainebleau (Barbeau)

Intensity  
(length, T anomaly)

1st

2nd

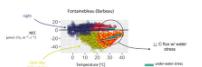
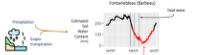
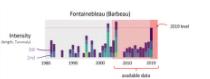
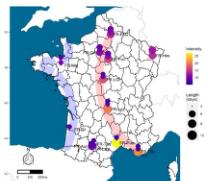


2019 level

available data

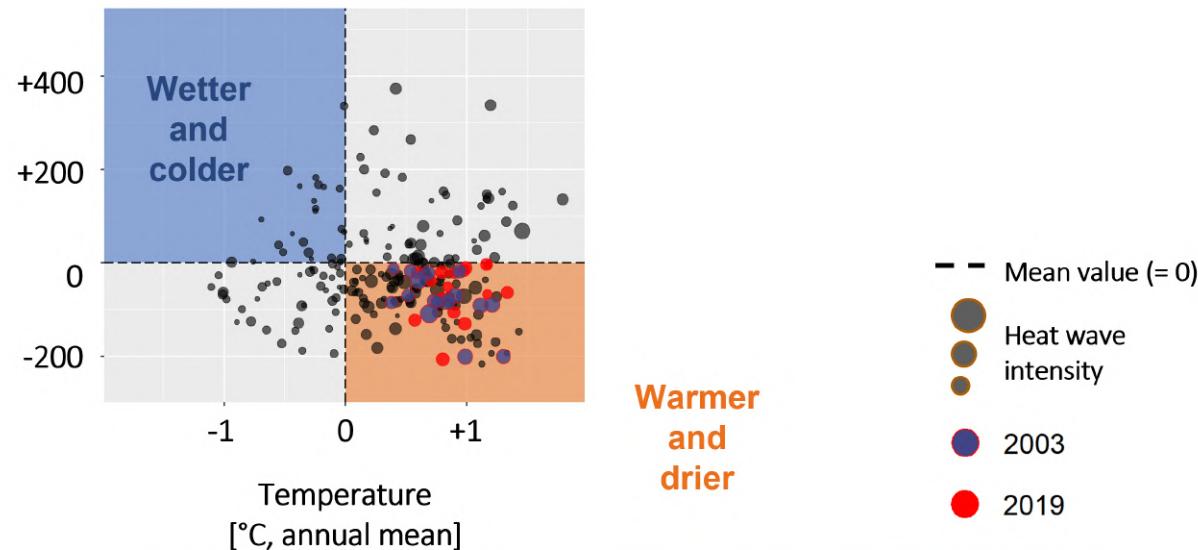
# Data Exploration

## Heat Waves during Drier and Warmer Years



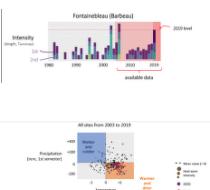
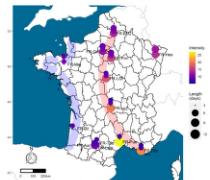
Precipitation  
[mm, 1st semester]

All sites from 2003 to 2019



# Data Exploration

## Water Stress and Heat Waves



# Data Exploration

## Estimated Soil Water Content

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- Model:

$$initialRU = 0$$

$$SW_t = \begin{cases} RU, & t = 1 \\ SW_{t-1} - ETR_t + P_t, & t > 1 \end{cases}$$

if  $SW_t > RU$  :  $SW_t = RU$  (lost)

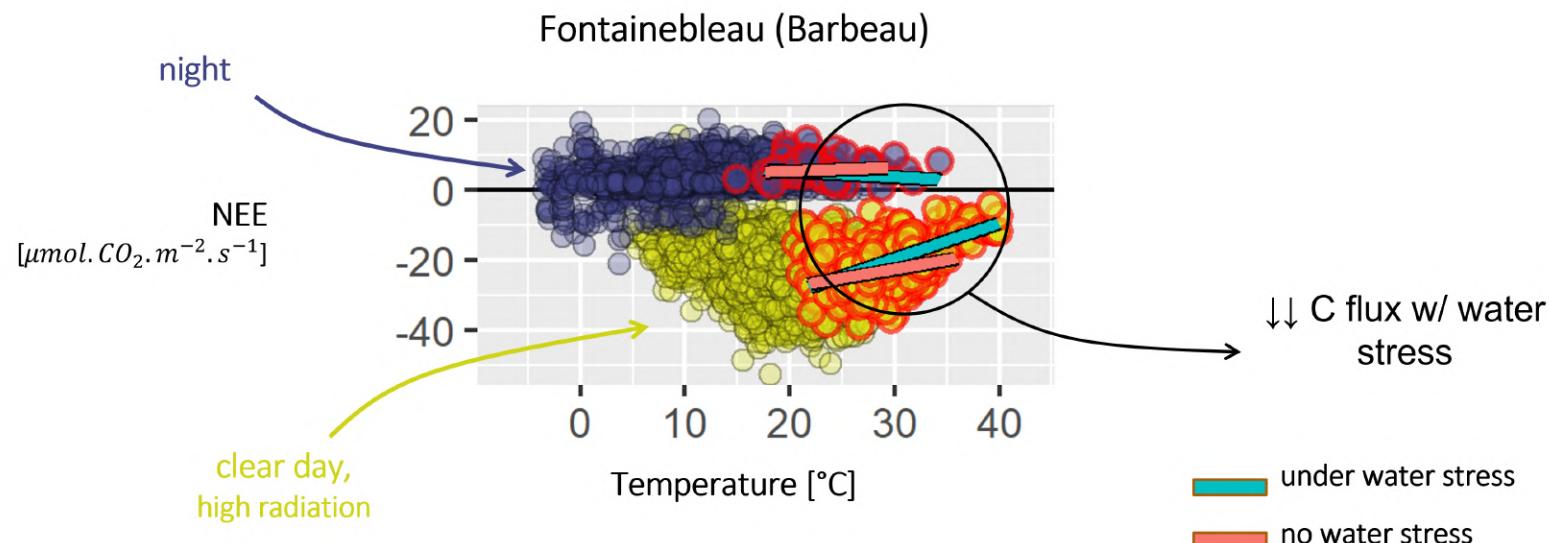
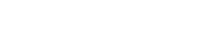
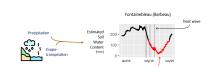
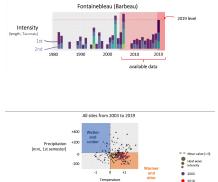
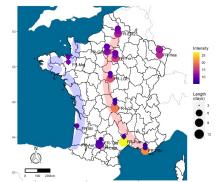
if  $SW_t < 0$  : restart avec  $RU + 1$

where, ETR and P are gapfilled data.

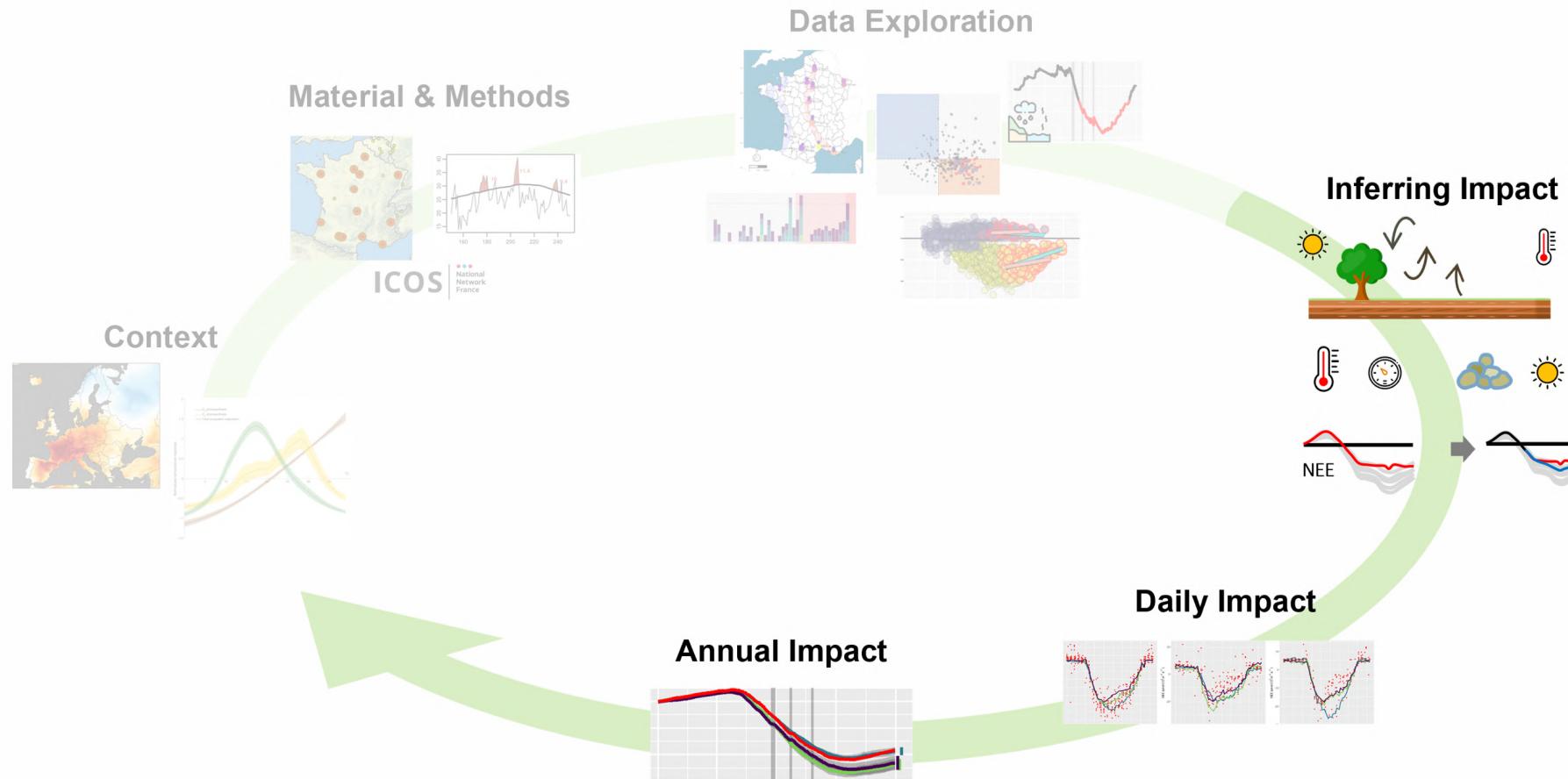
- Water Stress (40% of available water capacity).

# Data Exploration

## Water Stress and Carbon Flux

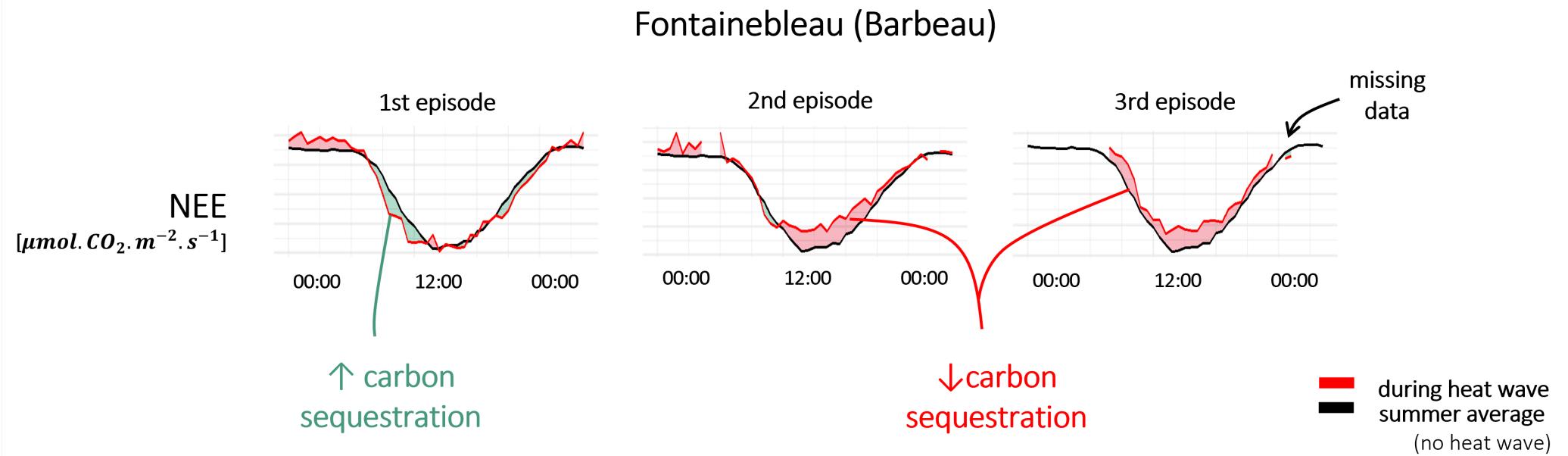


# Inferring Impact

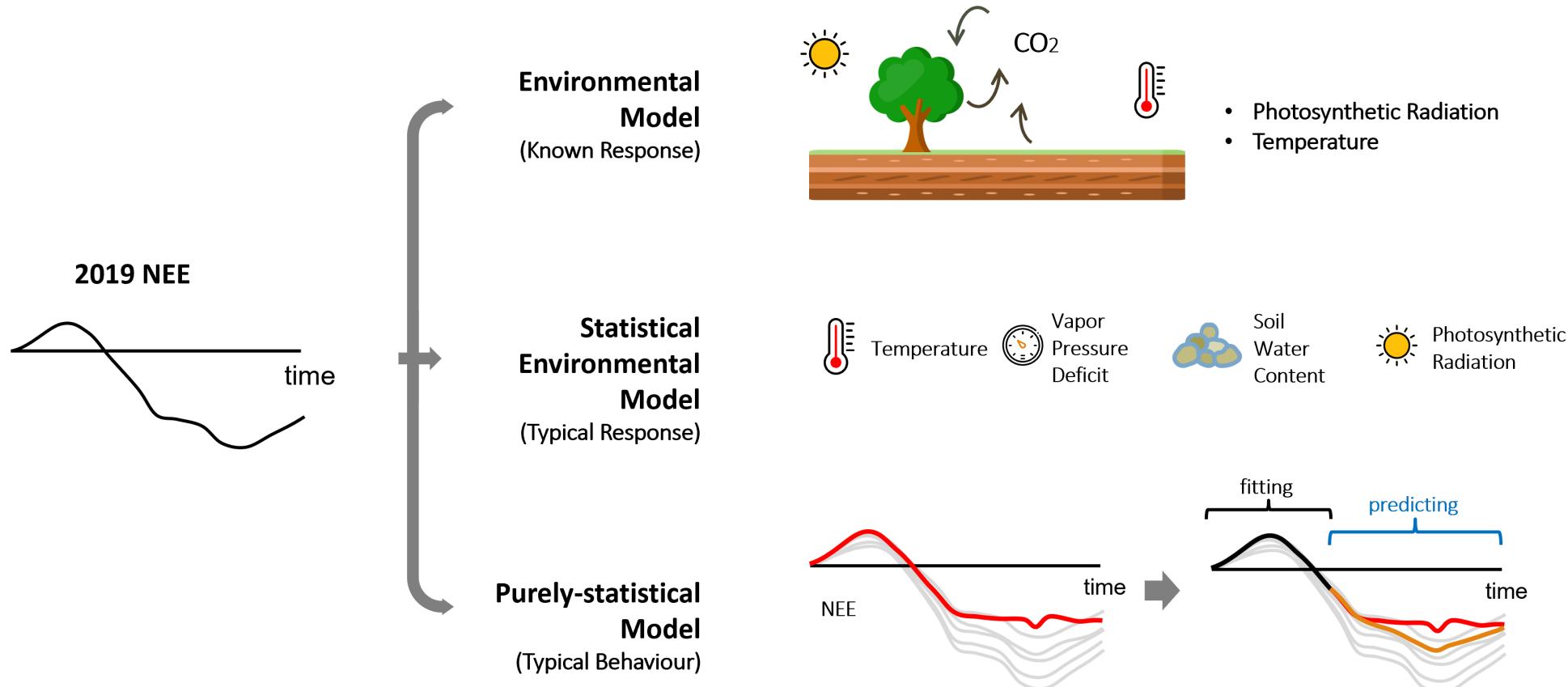


# Inferring Impact

## Hourly Average

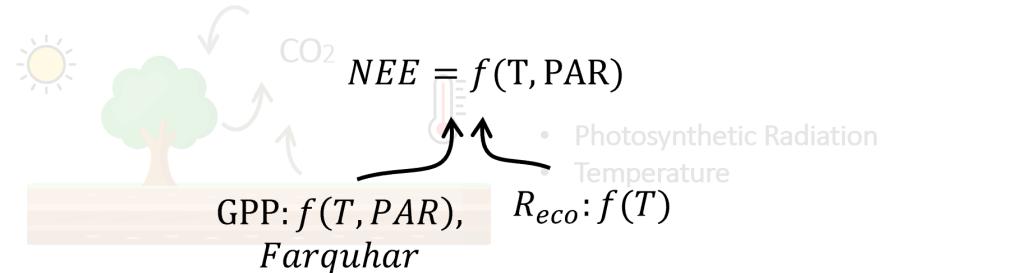
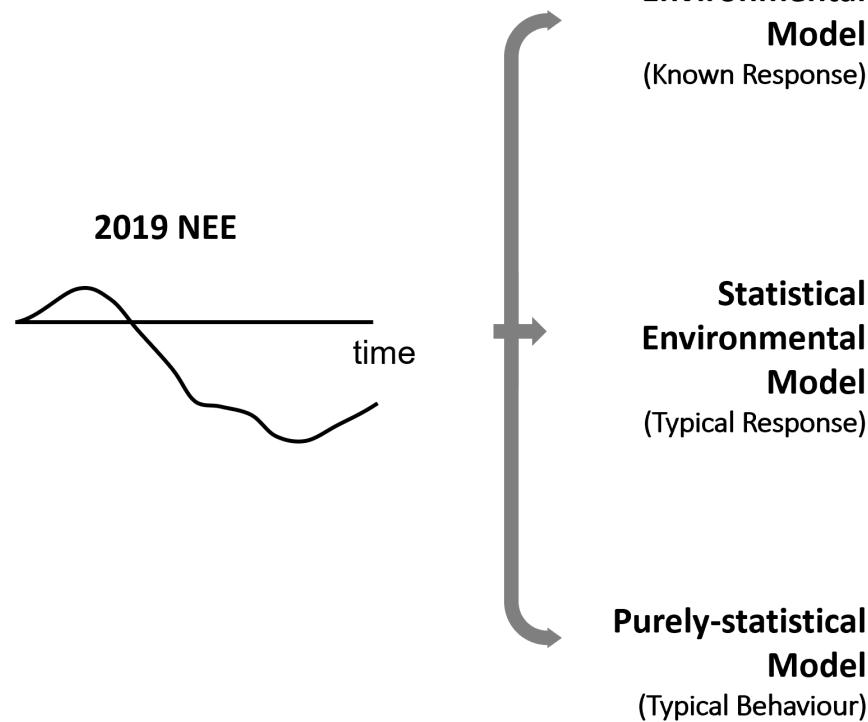


# Inferring Impact Modelling



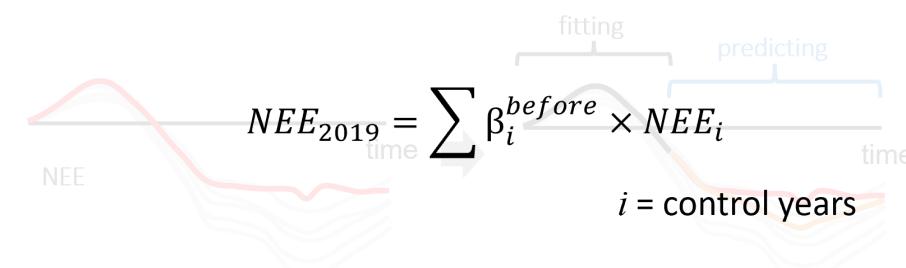
# Inferring Impact

## Modelling



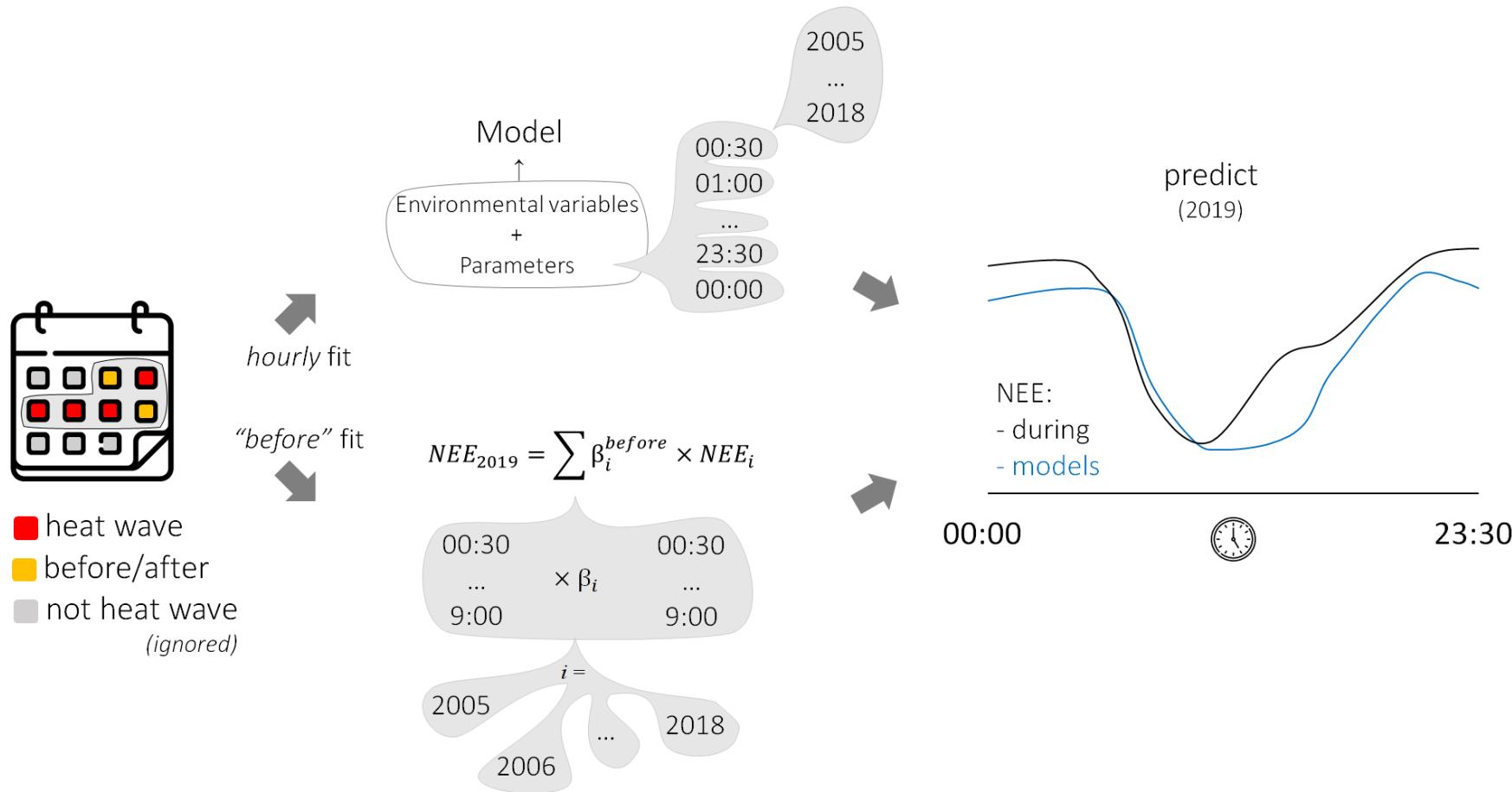
$$\text{NEE} = \beta_T^i \times T + \beta_{VPD}^i \times \text{VPD} + \beta_{SWC}^i \times \text{SWC} + \beta_{PAR}^i \times \text{PAR}$$

i = week of the year (annual), 30-min (daily)



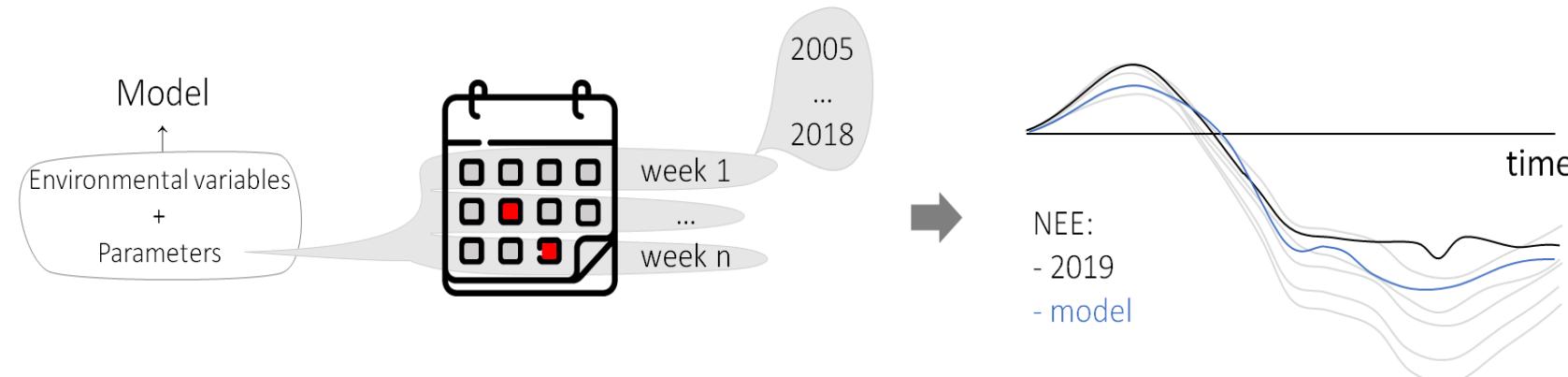
# Modelling Daily Impact

## parameter optimization

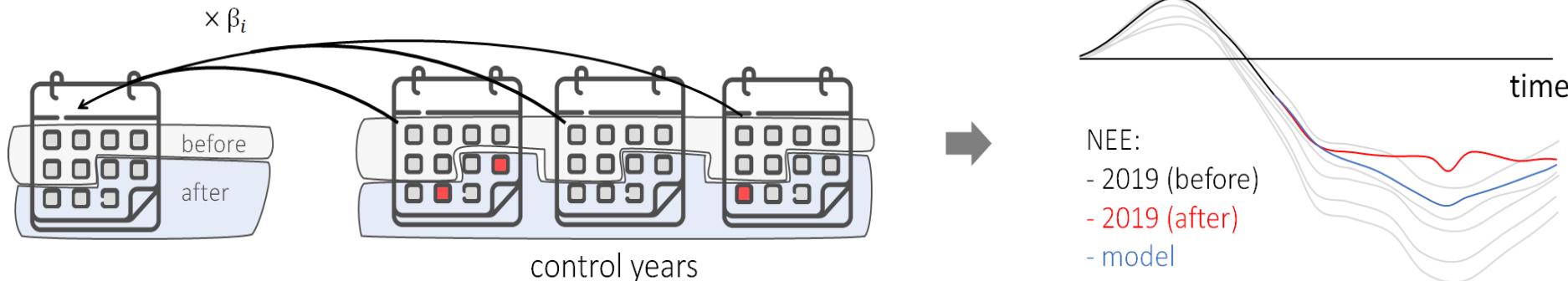


# Modelling Annual Impact

## parameter optimization

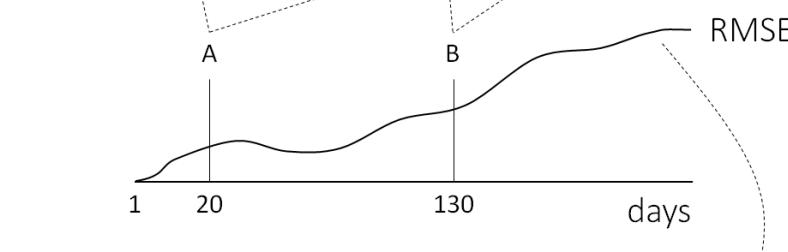
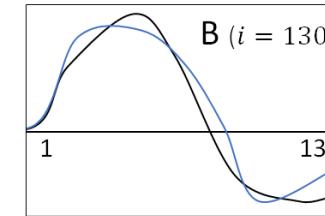
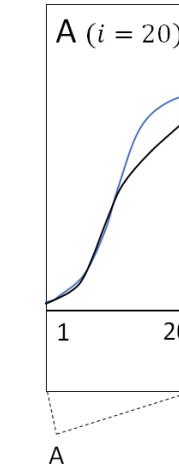
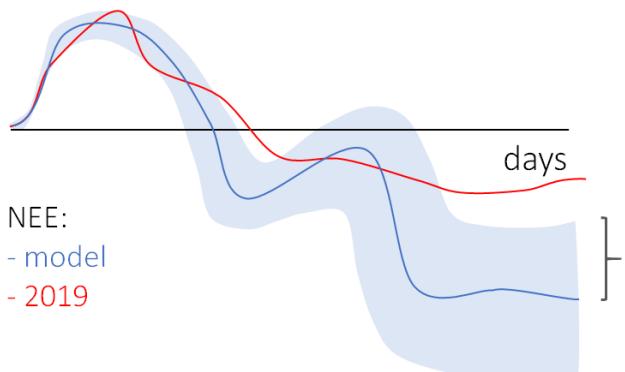
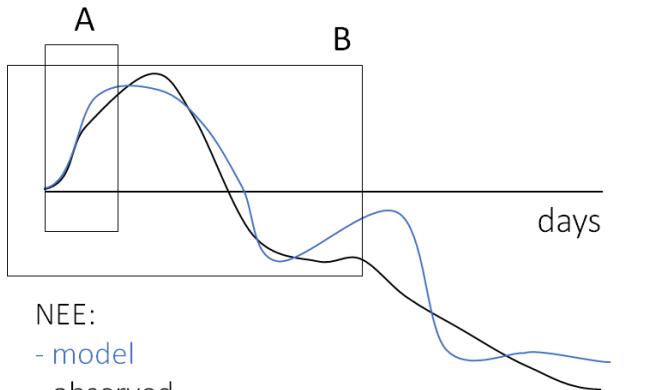


$$NEE_{2019} = \sum \beta_i^{before} \times NEE_i$$



# Modelling Annual Impact uncertainty

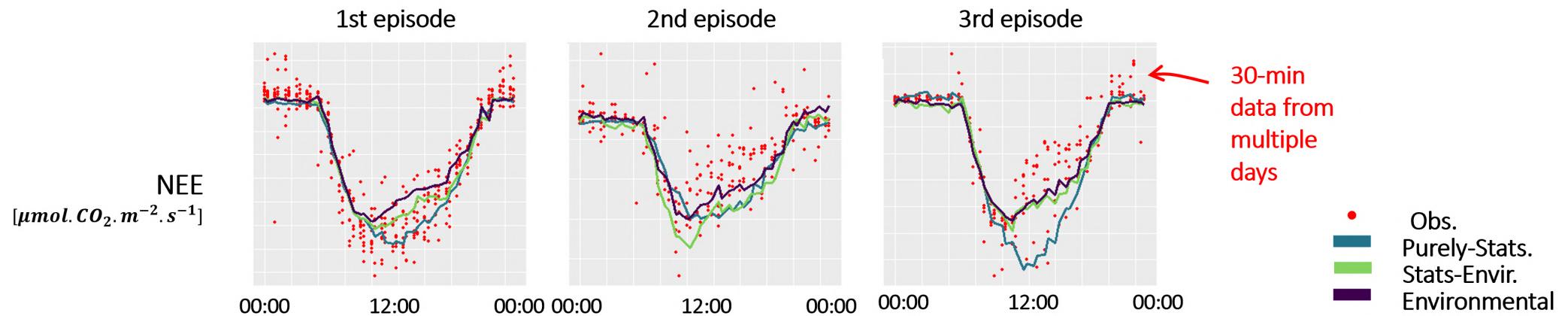
Applied to all control years (2005-2018)



$$RMSE_i = \sqrt{\frac{1}{i} \sum_{1}^i (NEE_{model} - NEE_{ori})^2}$$

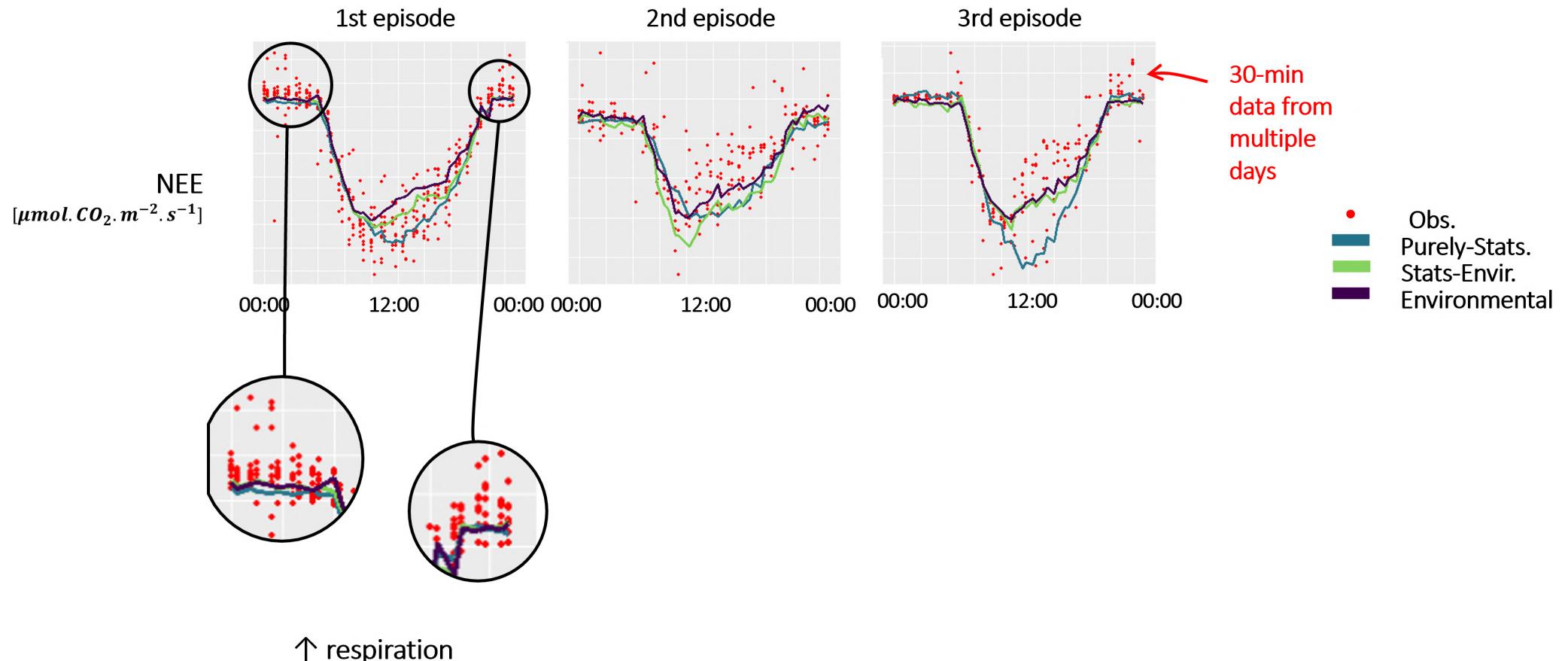
# Daily Impact

## Fontainebleau (Barbeau)



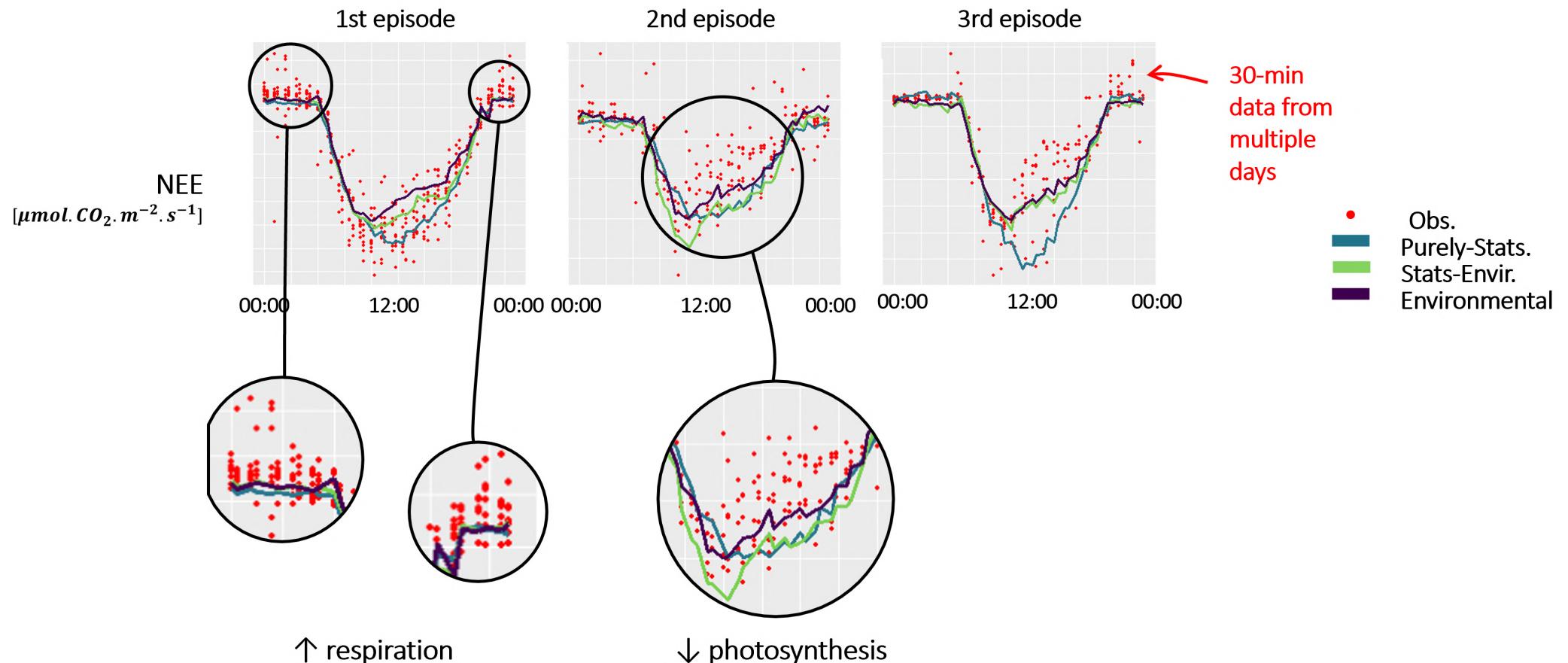
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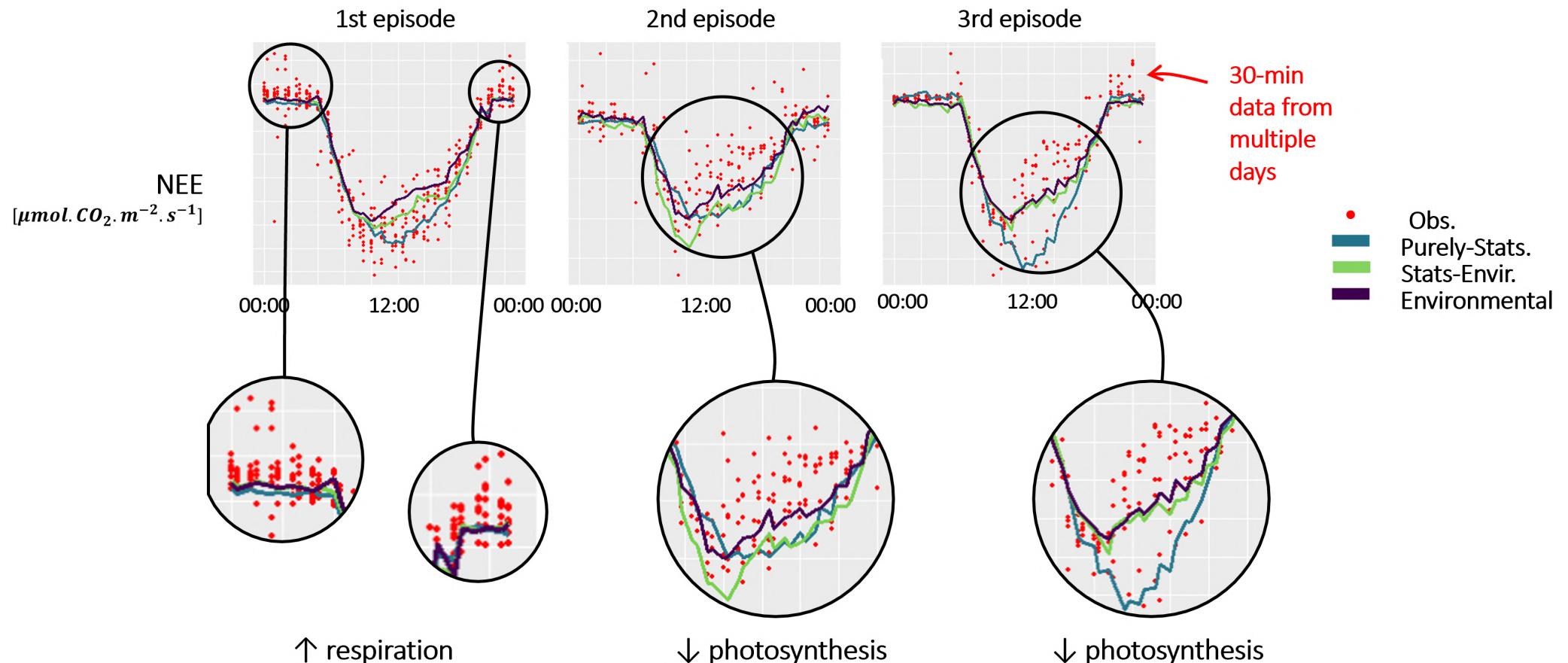
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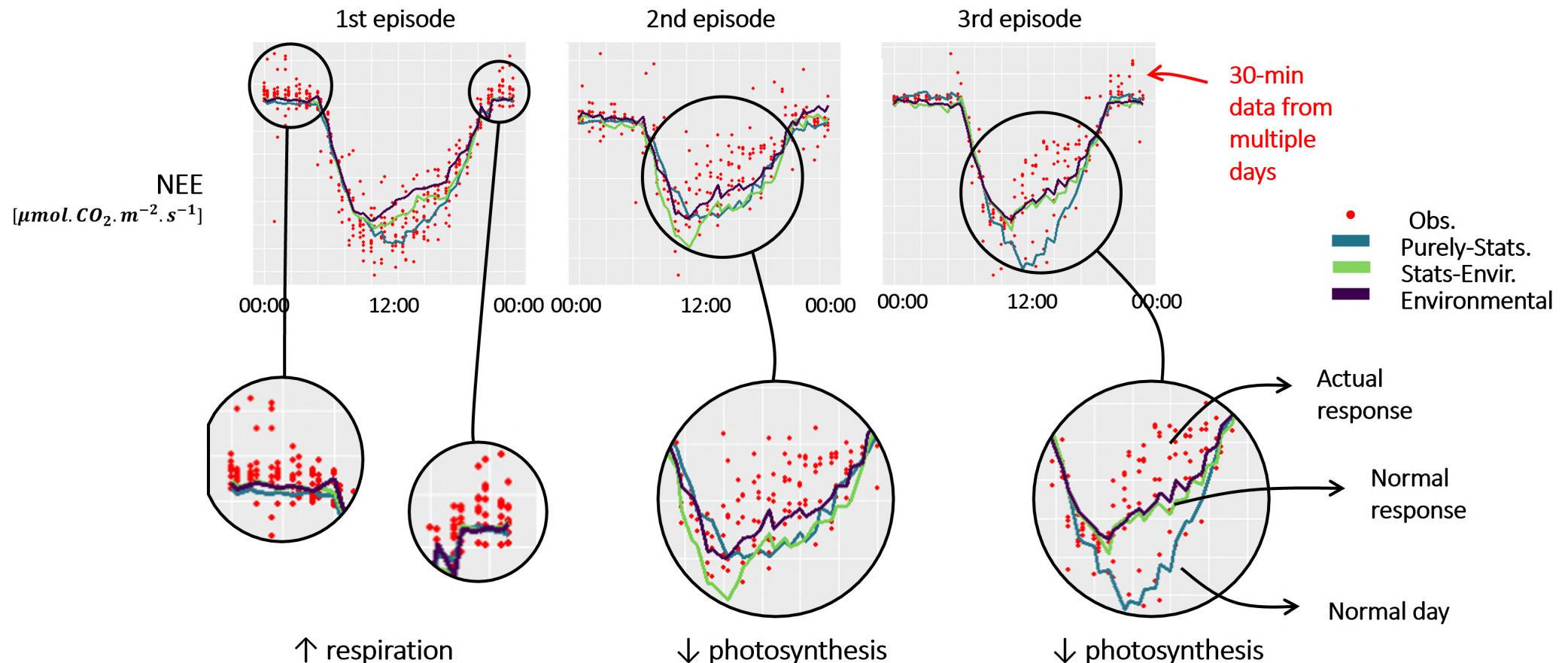
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## Fontainebleau (Barbeau)



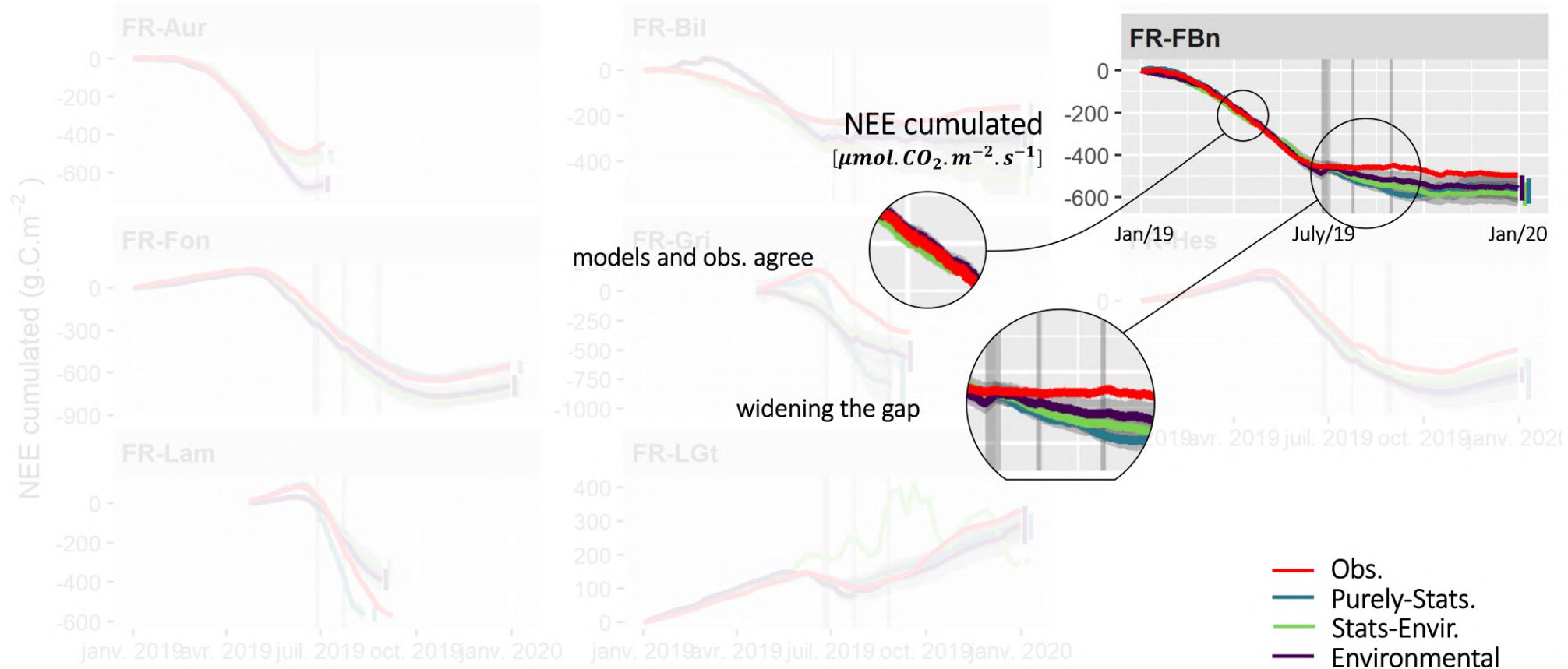
# Daily Impact

## Fontainebleau (Barbeau)



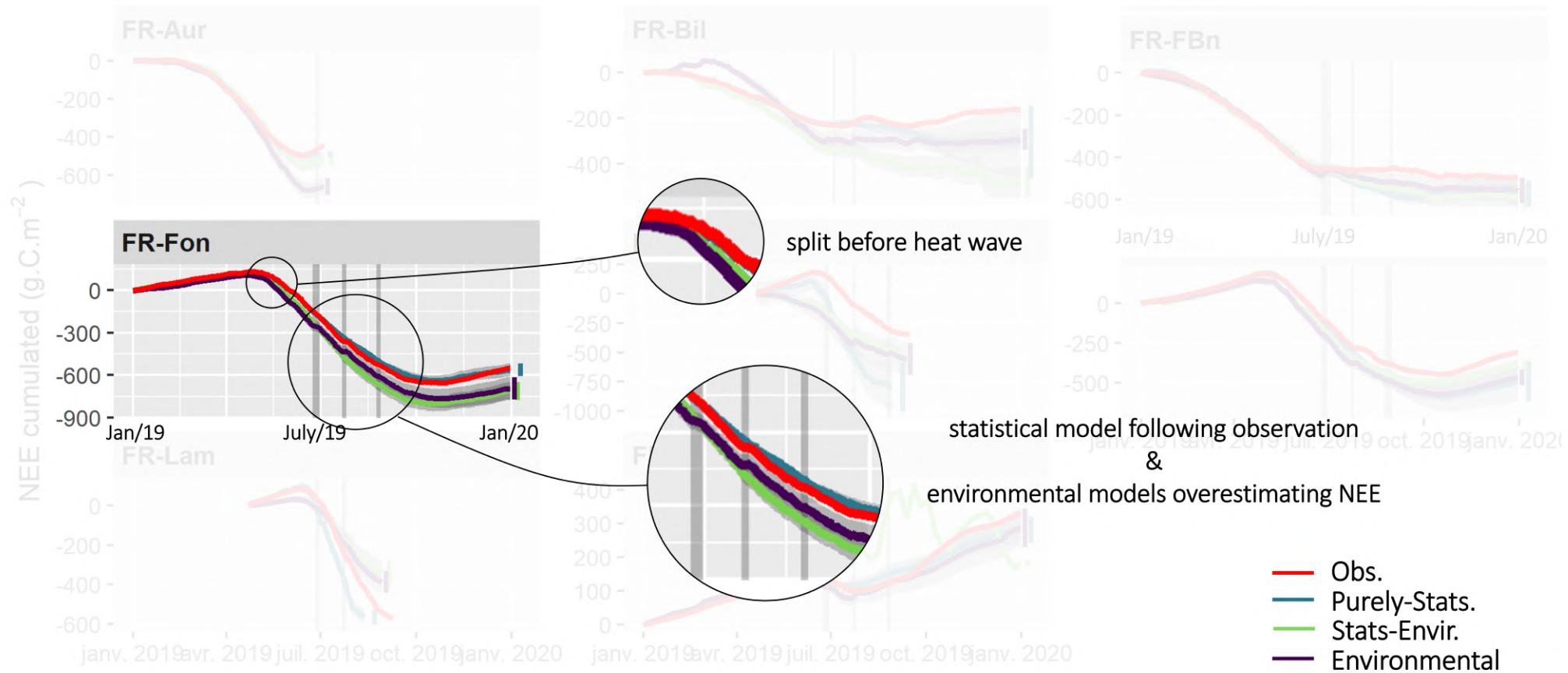
# Annual Impact

## Font-Blanche



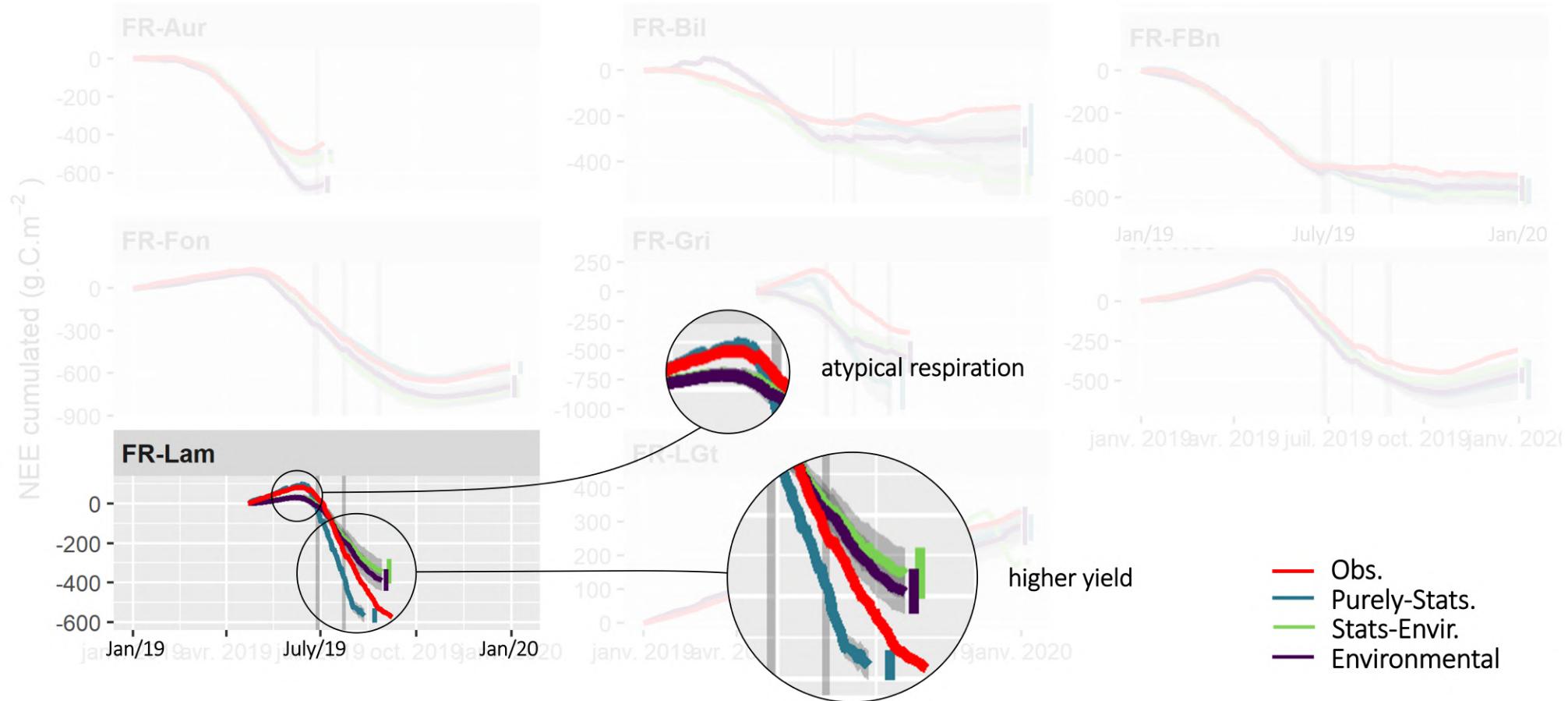
# Annual Impact

## Fontainebleau (Barbeau)



# Annual Impact

## Lamasquère



# Discussion

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- Sites where heat waves happened during a period of water stress consistently reduced carbon sequestration.
- Irrigation for agricultural sites may prevent decrease in carbon sequestration.
- Forests sites sequestered  $15 \sim 316 g. C. m^{-2}. yr^{-1}$  less than predicted (w/ uncertainty  $\pm 34 \sim 157 g. C. m^{-2}$ ).
- In 2018, drought-induced decline of carbon flux for forests  $182 \pm 42 g. C. m^{-2}. season^{-1}$  (Fu et al., 2020)

# Take-home messages

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- Models can be useful in identifying periods when the site is underperforming in terms of carbon sequestration and apply appropriate tools to mitigate the impact.
- Reduction of ecosystem carbon sink behavior, as induced by higher temperatures, was found to be linked to water stress.
- In agricultural sites results suggest that irrigation can prevent negative impacts. This may lead to higher water demand in the future.
- Due to climate change, the frequency and intensity of heat waves (and droughts) is expected to increase.  
In the absence of any process faster than it, we are partially loosing the help of these ecosystems in the fight against it.

Thank you