

# Applying a high-resolution atmospheric inversion framework to CO<sub>2</sub> observations using GRAMM/GRAL

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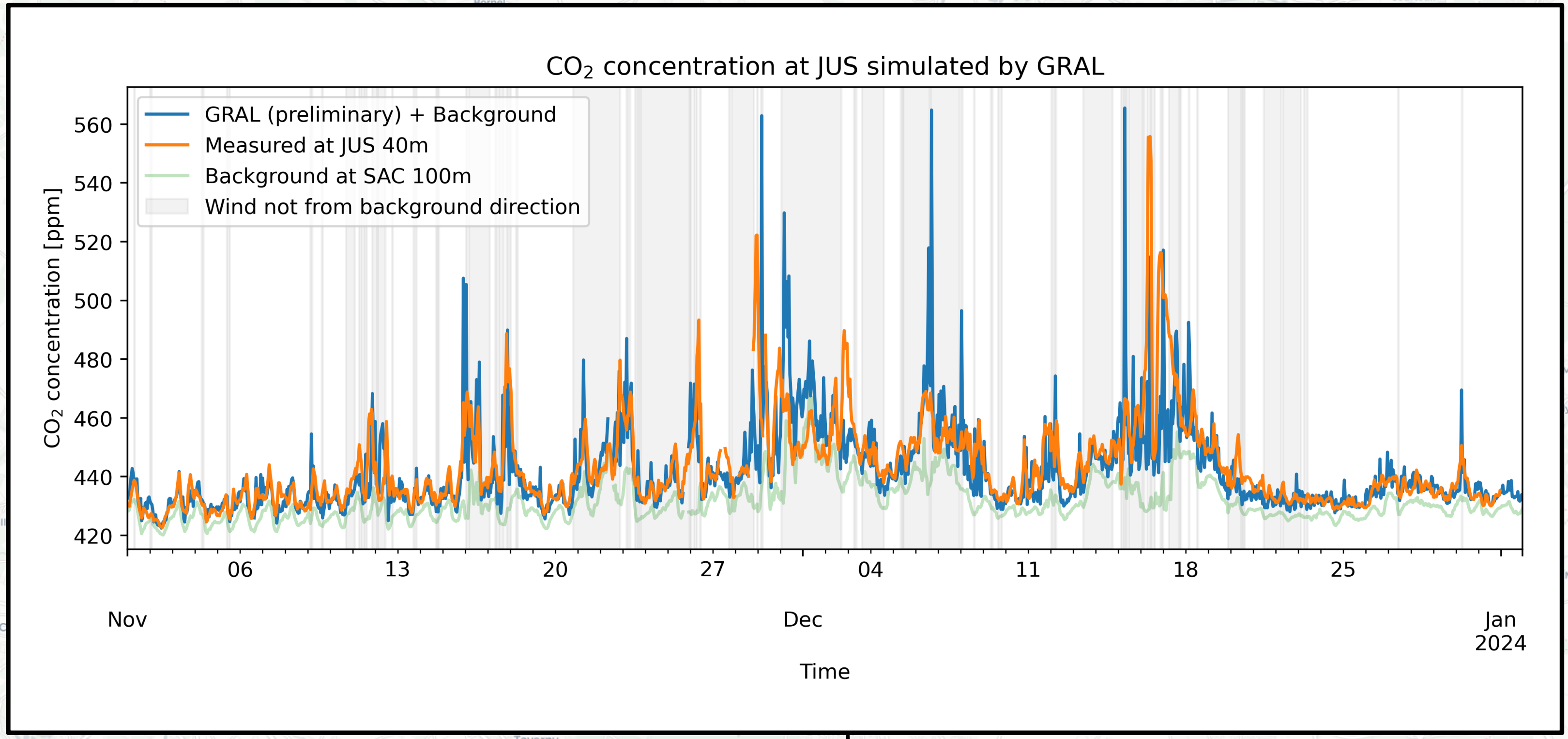
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### Why simulate urban CO<sub>2</sub> emissions with GRAMM/GRAL?

- Urban areas: Important role in climate change mitigation
- But: difficult to quantify emissions by sector

We use the model GRAMM/GRAL to simulate atmospheric transport of CO<sub>2</sub> to estimate emissions from atmospheric measurements. GRAMM/GRAL produces steady-state hourly meteorological wind fields which are used for a Lagrangian particle model in GRAL to create concentration fields. The hourly situations are stored in a catalogue. This catalogue can be used to create time series by selecting the appropriate entry for a given meteorological situation. With this approach, a horizontal resolution of 10m x 10m is possible even for yearly time series.



### Simulated concentrations

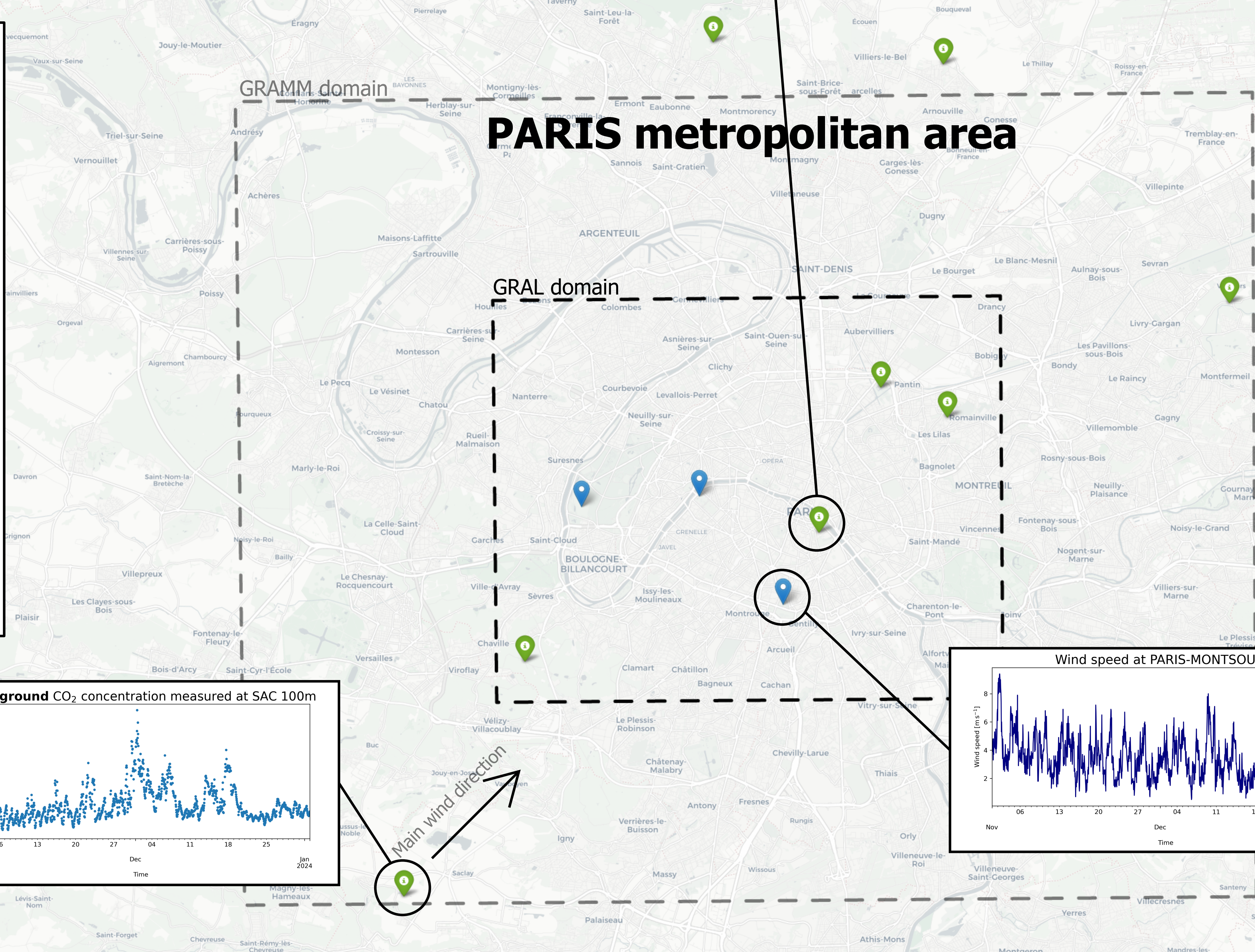
- Catalogue of concentration maps per hourly meteorological situation
- Time evolution of emissions by grouping in sectors and applying sector specific scaling factors

The catalogue can be used for atmospheric inversions because the hourly steady-state assumption allows to link concentrations with emissions at the same hour. Next to the high-resolution, the advantage of GRAMM/GRAL is the low computational cost once the catalogue has been computed.

### Model input

- Maps: CO<sub>2</sub> emissions (anthropogenic) from TNO (Super et al., 2020), land cover, buildings, and terrain
- Meteorological measurements for a match-to-observations algorithm (May et al., 2024)
- Catalogue of 1008 possible hourly meteorological conditions defined by wind direction, speed, and stability class

Emissions, land cover, buildings, and terrain elevation input for GRAL.



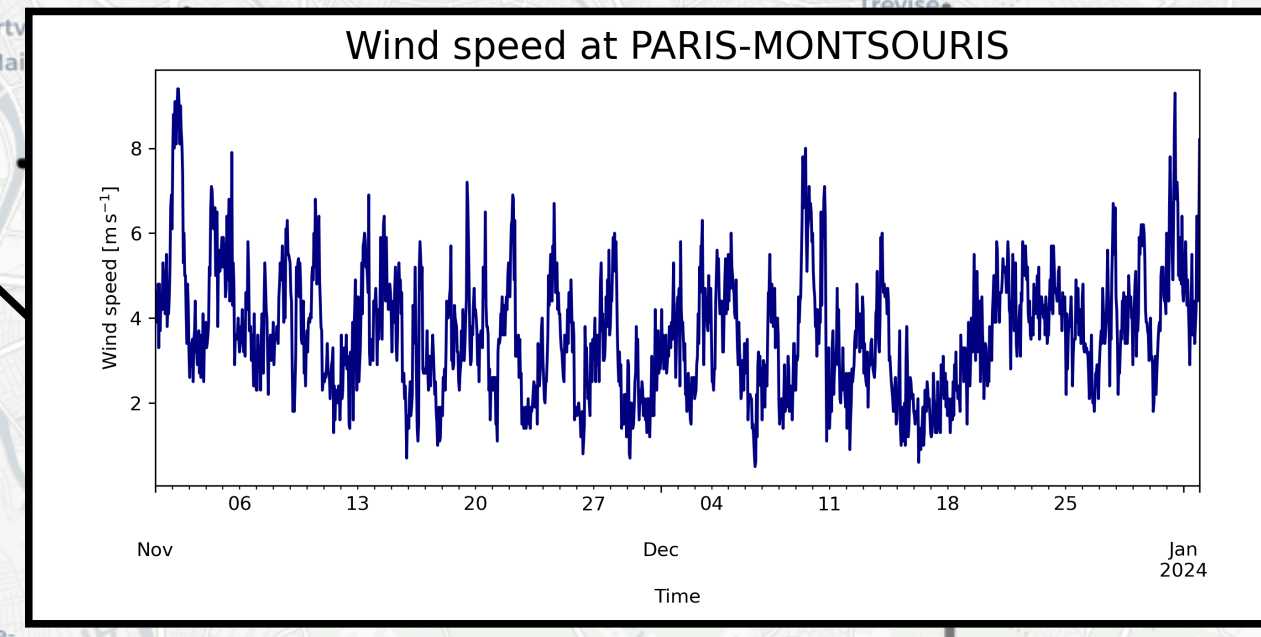
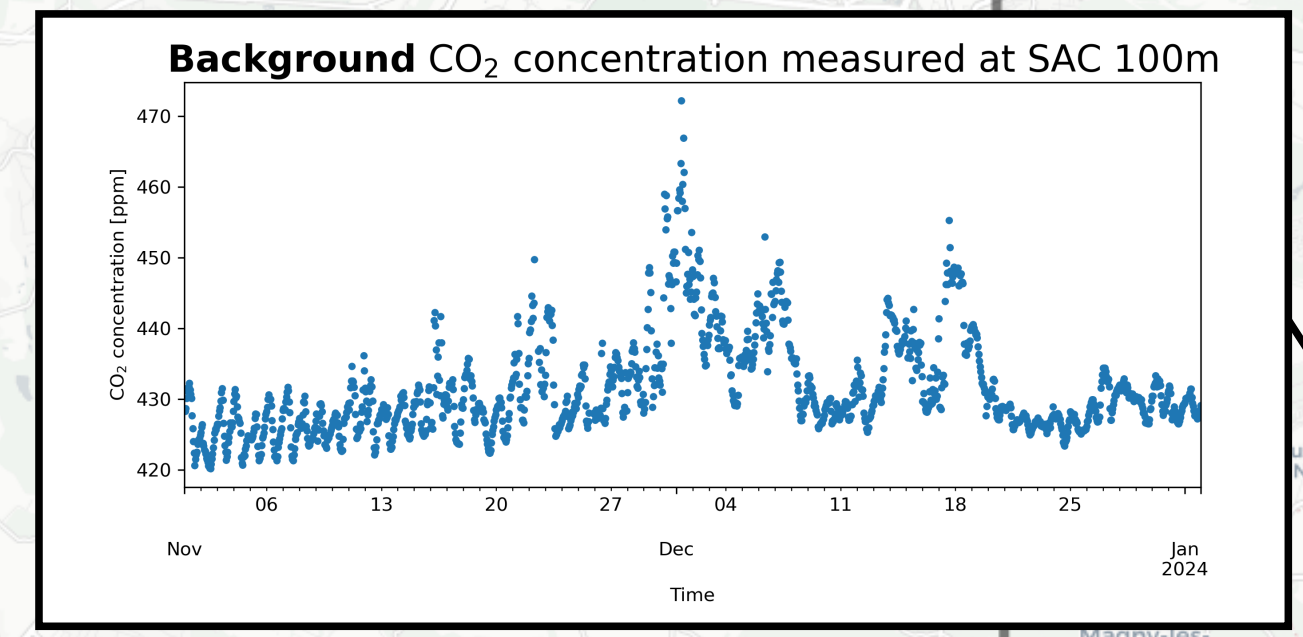
### Outlook: Inversion framework

- Goal: Constrain CO<sub>2</sub> emissions in Paris metropolitan area on high-resolution
- Inversion framework: Tested for Heidelberg (Vardag and Maiwald, 2024) as Observing System Simulation Experiment (OSSE) and will be transferred to Paris

Additional refinements:

- Include biogenic emissions
- Use more meteorological stations
- Increase the resolution of emissions to harness the high-resolution of GRAMM/GRAL
- Look at high- and mid-cost sensors
- Explore additional background options

Optimal network configurations from the framework applied in Heidelberg (Vardag and Maiwald, 2024)



### References

May, Maximilian, Simone Wald, Ivo Suter, Dominik Brunner, and Sanam N. Vardag. "Evaluation of the GRAMM/GRAL Model for High-Resolution Wind Fields in Heidelberg, Germany". Atmospheric Research 300 (15 April 2024): 107207. <https://doi.org/10.1016/j.atmosres.2023.107207>.

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Laurent, O., Chariot, M., Lian, J., Utard, H., and Ramonet, M.: Paris Mid-cost CO<sub>2</sub> sensor network, EGU General Assembly 2024, Vienna, Austria, 14–19 Apr 2024, EGU24-19886, <https://doi.org/10.5194/egusphere-egud24-19886>, 2024.

### Data sources

Emissions: TNO CO<sub>2</sub> fossil and biogenic fuel area emissions  
 Landuse: Urban Atlas Land Cover/Land Use 2018 (vector)  
 Buildings: Urban Atlas Building Height 2012 (raster 10 m)  
 Terrain: RGE ALTI@ 1M, Institut national de l'information géographique et forestière  
 Meteorological data: Meteo France  
 CO<sub>2</sub> mole fractions: ICOS and ICOS Cities kindly provide measurements for this study.

This publication has been prepared using European Union's Copernicus Land Monitoring Service information; <https://doi.org/10.2909/fb4dfa1-6ceb-4cc0-8372-1ed354c285e6>, <https://doi.org/10.2909/42690e05-edf4-43fc-8020-33e130f62023>.



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