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Assessing the constraint of the CO₂ monitoring mission on fossil fuel emissions from power plants and a city in a regional carbon cycle fossil fuel data assimilation system

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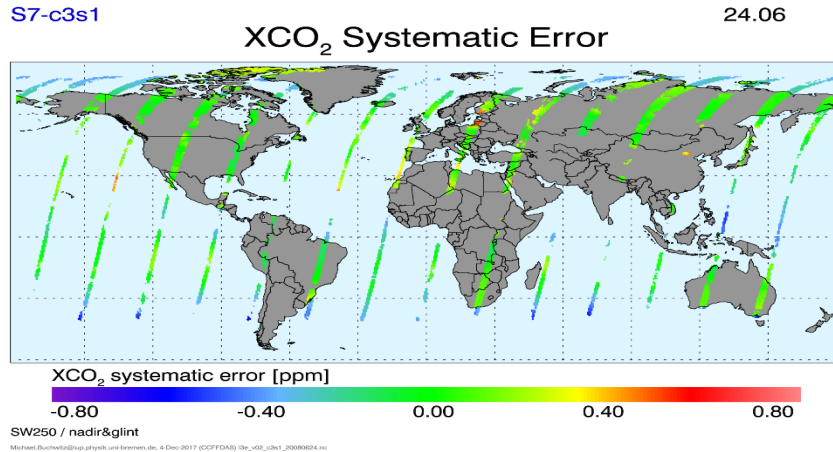
8 ESA, Noordwijk, The Netherlands

LPS, Bonn, 26 May 2022



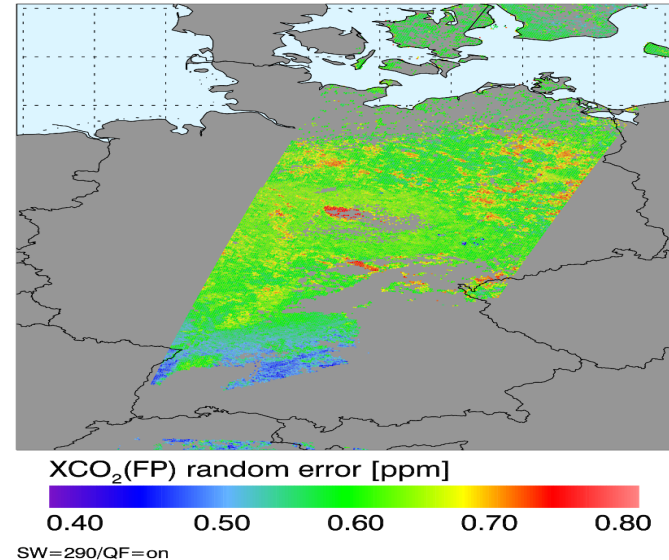
The CO₂ Monitoring Mission (CO2M)

- Planned by Copernicus Programme for a 2025 launch
- Multi-Satellite Constellation
- Imaging Capability at 2 km x 2 km grid with wide swath
- XCO₂, NO₂, Multi-Angular Polarimeter (Aerosols)



S7-c3s2 24-Jun

XCO₂(FP) random error



Michael.Buchwitz@sup.physik.uni-bremen.de, 30-Nov-2017, v5(pmf, c3s2) data_v01(pmf_v02_c3s2_2008176_1125.h5_SW290.ae2)

Capabilities of the Copernicus CO2MVS capacity

1.5.1 Stepwise approach for a CO₂ emissions MVS capacity

The need and capabilities for a Monitoring and Verification Support capacity have been illustrated in previous sections using projections of emissions based on current inventories and two plausible scenarios. These analyses have highlighted the necessity for this system to properly address the following set of capabilities:

C1. Detection of hot spot. A hot spot is defined as a small area surrounded by a strong CO₂ concentration gradient, because the area contains a large emitting CO₂ source. This can be a large power plant, a megacity or any other activity characterized by strong CO₂ emissions with different time evolution;

C2. Monitoring the emissions of the hot spot. Consecutive measurements are needed to link the measured emission level to previous measurements and to monitor local emission reductions of the activities within the hot spot. The accuracy of the measurements must ensure the capability to attribute CO₂ emissions anomalies relative to the CO₂ concentration background level;

C3. Assessing emission changes against local reduction targets. This concerns the monitoring of the implemented emission reduction strategies on the hot spots, which all add up to achieve NDC targets. In the EU this requires the monitoring, at the most appropriate time scale, of not only the point source facilities (which are under the Emissions Trading System) but also the megacities with peak emissions of transport and buildings;

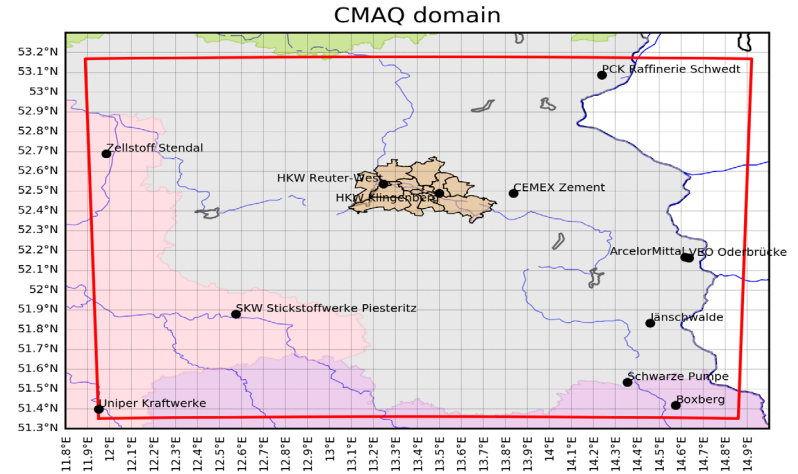
C4. Assessing the national emissions and changes with 5 year time steps. This requires the entire screening of the full area covered by the country, in order to account for changes in emission patterns with new or occasional hotspots.

Assessments require high-resolution modelling of CO2M Images

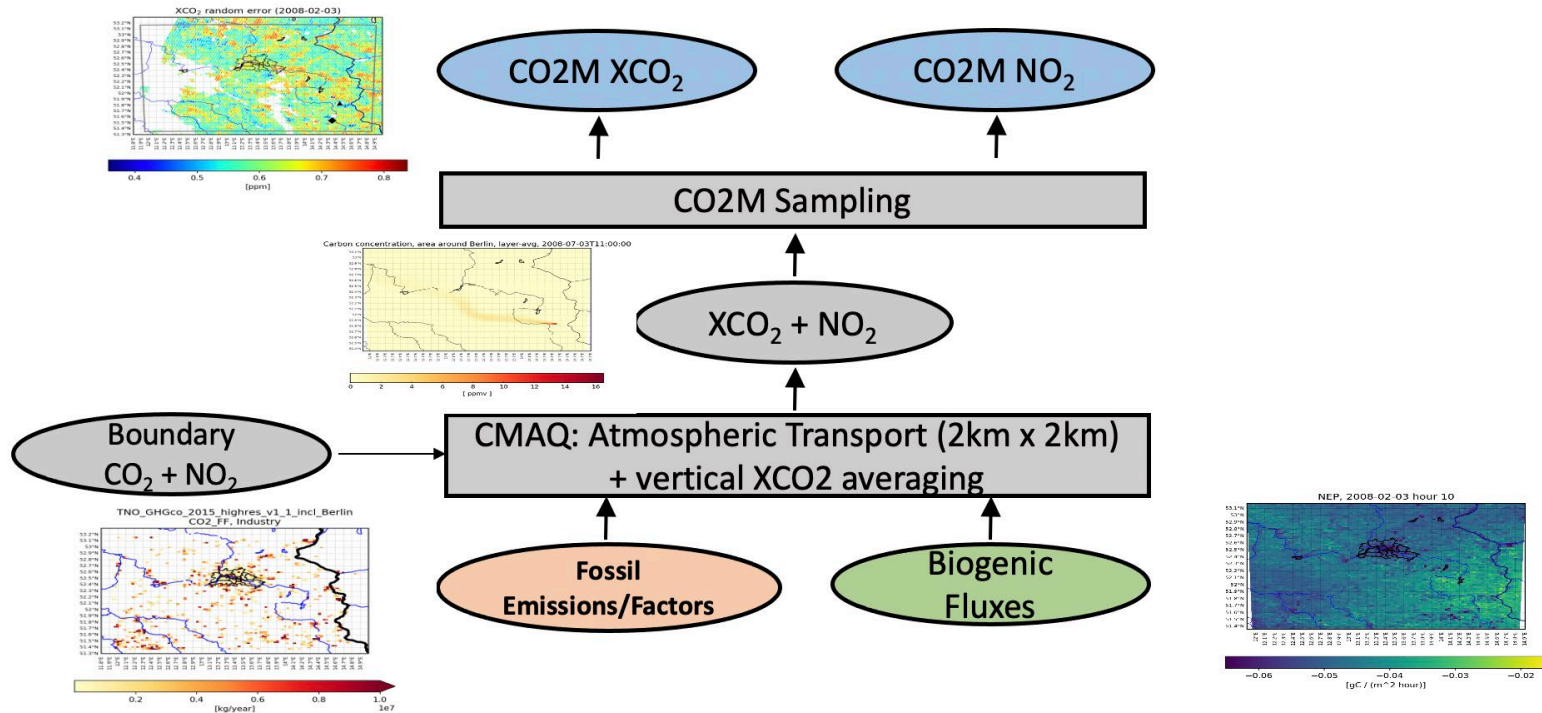
High resolution set-up over Berlin

Modelling System:

- CMAQ in 2 km x 2 km resolution
- 200 km area around Berlin
- Use simulated CO2M images
- Assess accuracy requirement for XCO2 alone
- And in conjunction with NO₂
- Assess added value of a multi-angular polarimeter (MAP)
- Simulating 24 hour period before overpass



Modelling chain



Quantitative Network Design

Uncertainty

$$\mathbf{C}(d)^2 = \mathbf{C}(d_{\text{obs}})^2 + \mathbf{C}(d_{\text{mod}})^2.$$

$$\mathbf{C}(x)^{-1} = \mathbf{M}'^T \mathbf{C}(d)^{-1} \mathbf{M}' + \mathbf{C}(x_0)^{-1}.$$

$$\sigma(y)^2 = \mathbf{N}' \mathbf{C}(x) \mathbf{N}'^T + \sigma(y_{\text{mod}})^2.$$

$$\sigma(y_0)^2 = \mathbf{N}' \mathbf{C}(x_0) \mathbf{N}'^T + \sigma(y_{\text{mod}})^2.$$

Performance Metric
“uncertainty reduction”

$$\frac{\sigma(y_0) - \sigma(y)}{\sigma(y_0)} = 1 - \frac{\sigma(y)}{\sigma(y_0)}.$$

What we do know already

Coverage

Notation:

y: vector of target quantities
d: vector of observations
x: vector of unknowns/control variables

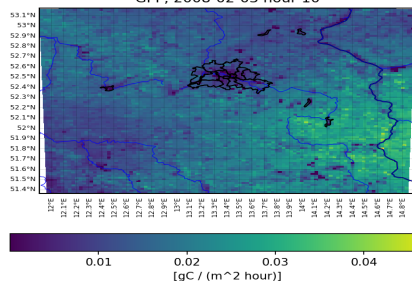
d=M(x): model linking unknowns to observations
y=N(x): model linking unknowns to target quant

C: covariance of uncertainty

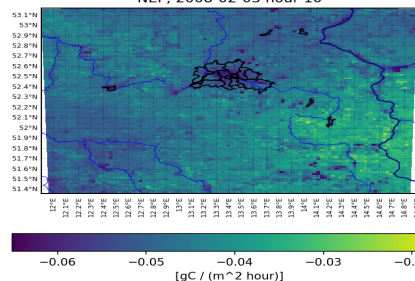
Model for terrestrial fluxes

- Newly developed version of SDBM (Knorr and Heimann, 1995)
- Runs on transport model grid (2 km by 2 km)
- Simulates Net and Gross (GPP, ecosystem respiration) fluxes at hourly time step
- Driven by JRC-TIP FAPAR and climate (Incoming solar/thermal radiation, precipitation, 2m-temperature) from ERA5
- Calibrated 5 parameters against complete ensemble of Tier-1 166 Fluxnet 2005 sites
- Prior parameter uncertainty 20%

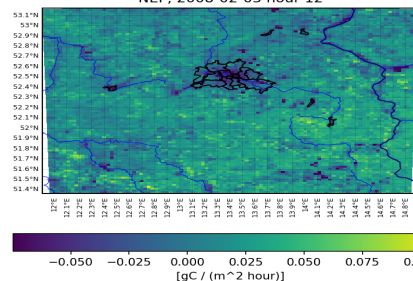
GPP, 2008-02-03 hour 10



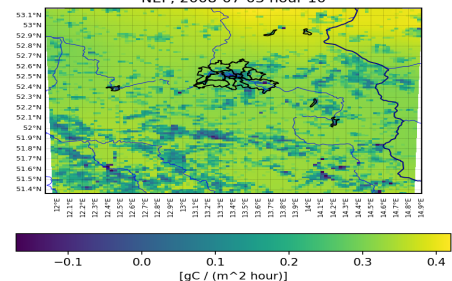
NEP, 2008-02-03 hour 10



NEP, 2008-02-03 hour 12



NEP, 2008-07-03 hour 10



Fossil fuel emissions

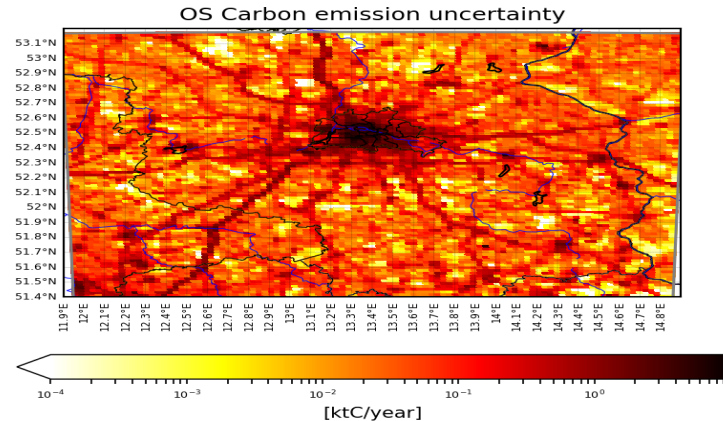
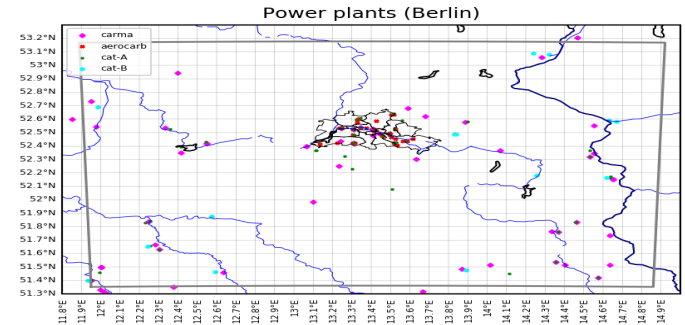
Based on Super et al, ACP, 2020:

Energy Generation

- Detailed plume simulation (VDI guidelines implemented by G. Kuhlmann) for largest power plants and some Vattenfall plants within Berlin: 11 plants in total; Stack information from A. Kerschbaumer (Berlin Kataster) and G. Kuhlmann.
- Standard Vertical Profile (Bieser et al., 2011) for the remainder
- Fixed temporal profile
- Prior Uncertainty: 20%

Other Sector

- “High resolution ($1/60^\circ \times 1/120^\circ$; $\sim 1 \times 1 \text{ km}$) regional gridded emission inventory for a zoom domain in Europe”
- Fixed temporal profile
- Prior Uncertainty: 20%

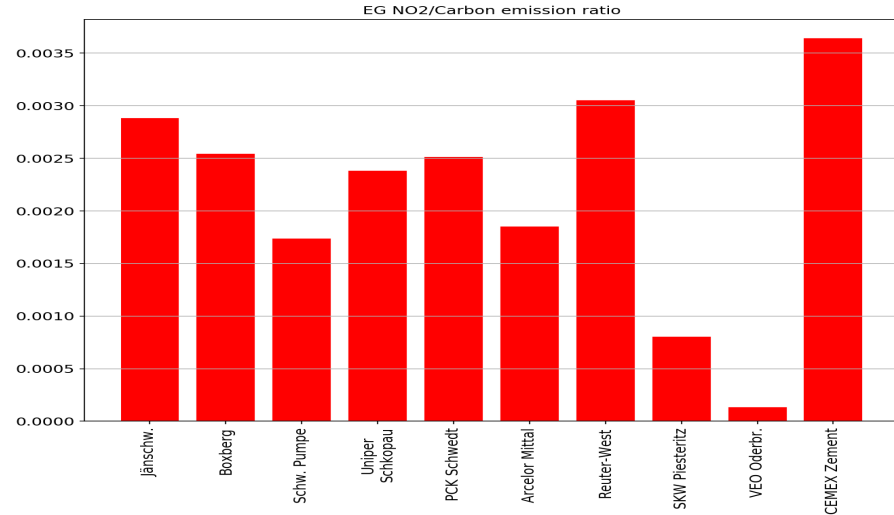


Emission factors: linking CO₂ and NO₂

$$e_{\text{NO}_2} = r e_{\text{CO}_2}$$

$$\text{NO}_2 = T_{\text{NO}_2} r e_{\text{CO}_2}$$

- **r**: emission ratio, provides link to CO₂
- Combined use of XCO₂ and NO₂ observations provides constraint on **r**
- Need prior and uncertainty in **r** -> from TNO data base (Super et al., 2020)

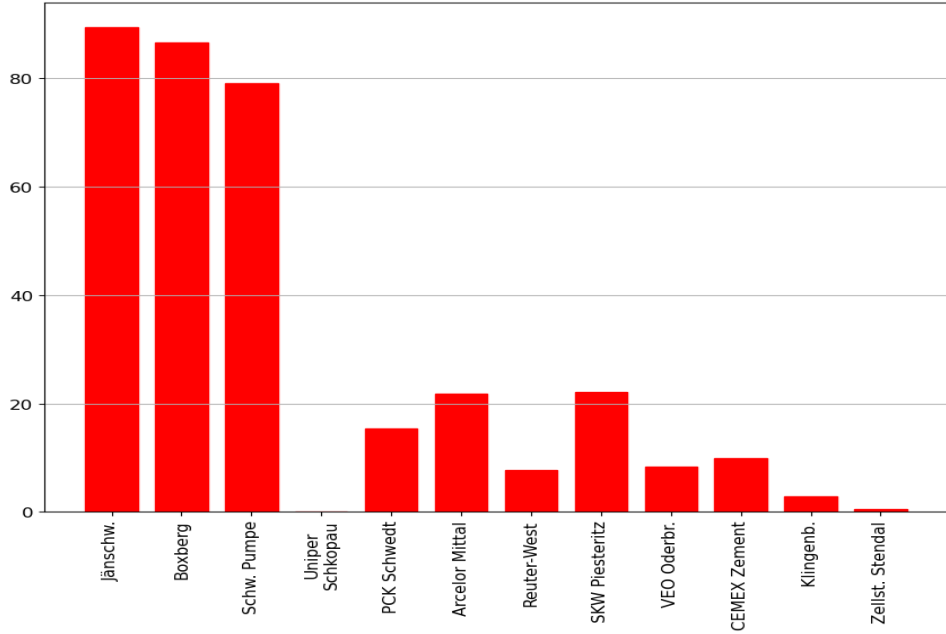


Setup default experiment

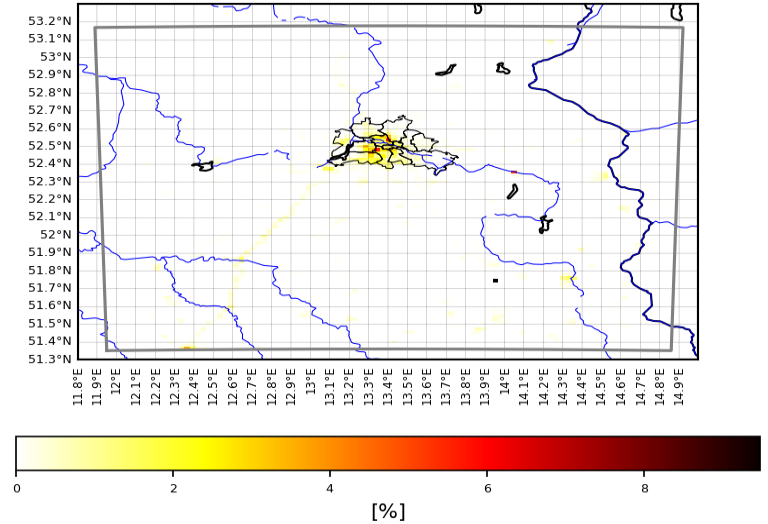
- XCO₂ retrieval uses MAP
- no NO₂
- 20% prior uncertainty for each power plant
- 20% prior uncertainty for each natural flux parameter
- 20% prior uncertainty of other sector for Berlin (city-scale, 52.8% at pixel level)
- 1 ppm uncertainty of lateral inflow, fully correlated at 10 km horizontally, otherwise uncorrelated

Default experiment, summer case

Uncertainty reduction at power plants (2008-07-03)

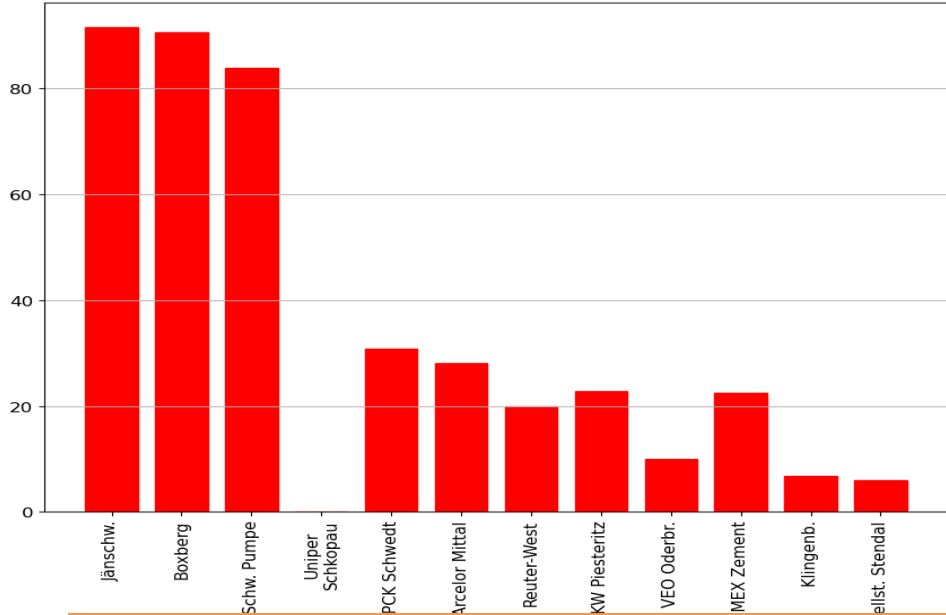


Uncertainty reduction other sector (2008-07-03)

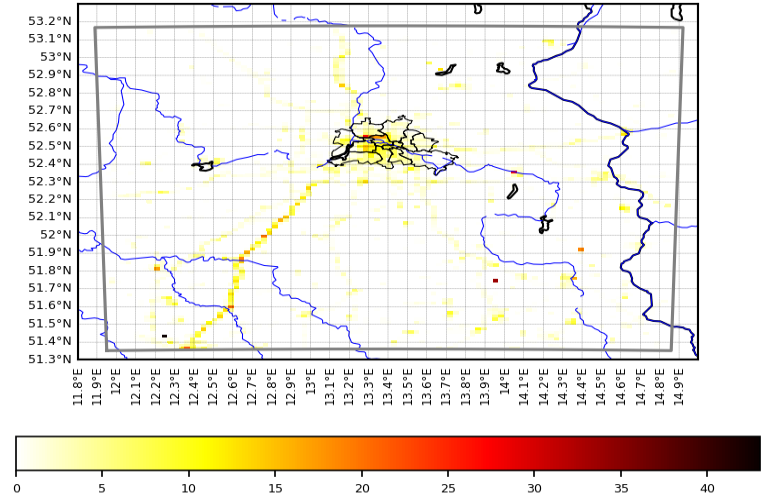


Default experiment + NO₂, summer case

Uncertainty reduction at power plants (2008-07-03)

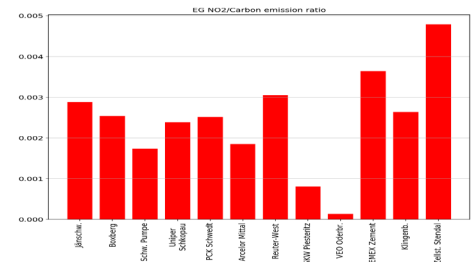


Uncertainty reduction other sector (2008-07-03)



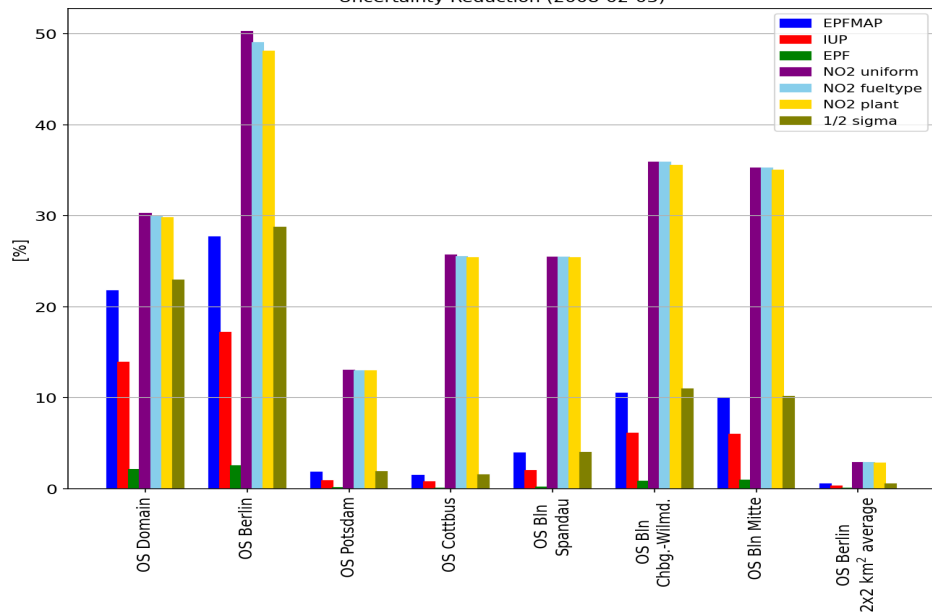
Adding NO₂:

- Added value for power plants larger in winter, where XCO₂ leaves more scope for improvement and where lifetime is longer
- But combined performance for XCO₂ and NO₂ better in summer

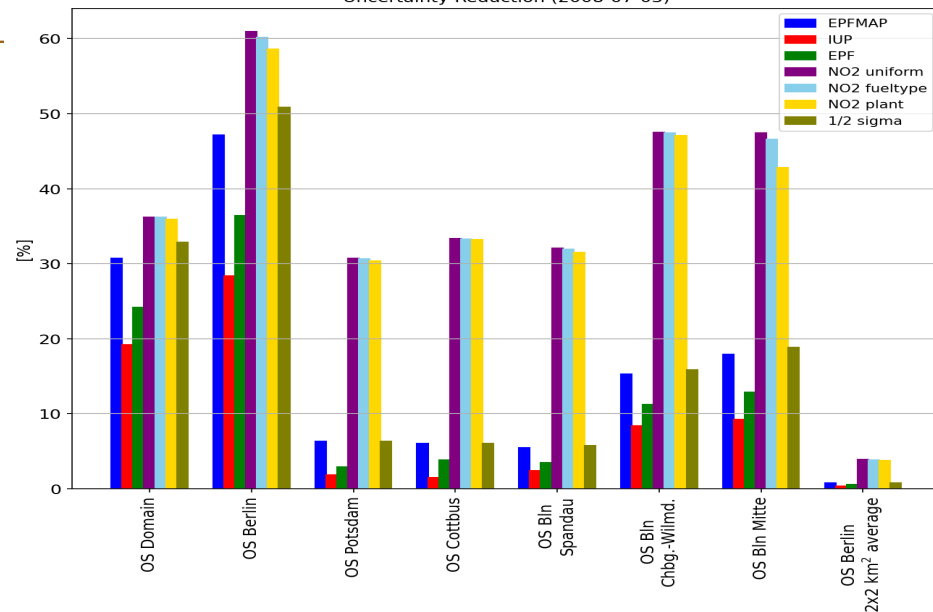


Overview Other sector

Uncertainty Reduction (2008-02-03)



Uncertainty Reduction (2008-07-03)



Performance for the other sector:

- Performance of default scenario better than that of IUP XCO2 error files on all scales
- The MAP has a strong impact, the added value is higher in winter, where the performance w/o MAP is low
- The smaller the scale the larger the effect of adding NO2
- The differentiation of uncertainty in the emission factor has a small impact over Berlin and some of its districts
- Reducing the prior uncertainty on plant emissions yields small improvement for the other sector

Summary and Outlook

- Developed modelling chain from parameters to XCO₂ and NO₂ observations
- Full Jacobian allows
 - decomposition of XCO₂ column in terms of spatial emission impact
 - rigorous uncertainty propagation (Quantitative Network Design approach) to assess CO₂M observation impact
- High XCO₂ constraint on emissions from larger power plants
- XCO₂ constraint on emissions from Other sector increasing with spatial scale from 2km (uncertainty reduction: <1% average; ~8% maximum) to scale of Berlin district (~2-18 %) to the scale of Berlin (28-48%).
- Higher XCO₂ constraint in summer on both, power plants and other sector
- The MAP has a strong impact in winter, where the performance w/o MAP is lower, its impact in summer is moderate
- NO₂ powerful additional constraint for power plants and other sector