

Co- assimilation of NH_3 and NO_2 satellite observations

with the LETKF methodology in the LOTOS-EUROS
model

T. Wizenberg, E. Dammers | TNO

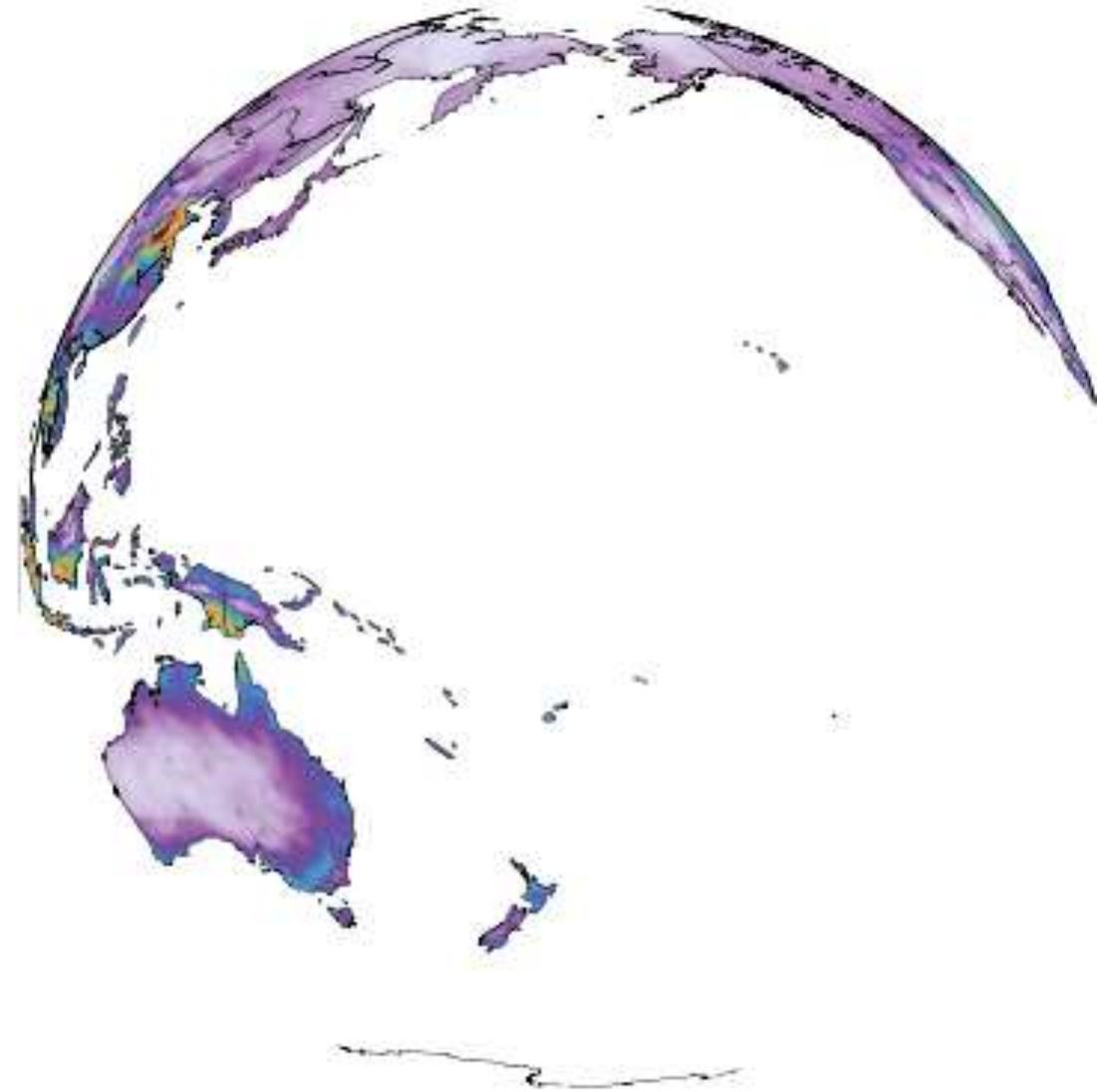
A. Segers, M. Schaap | TNO

M. Shephard | ECCC

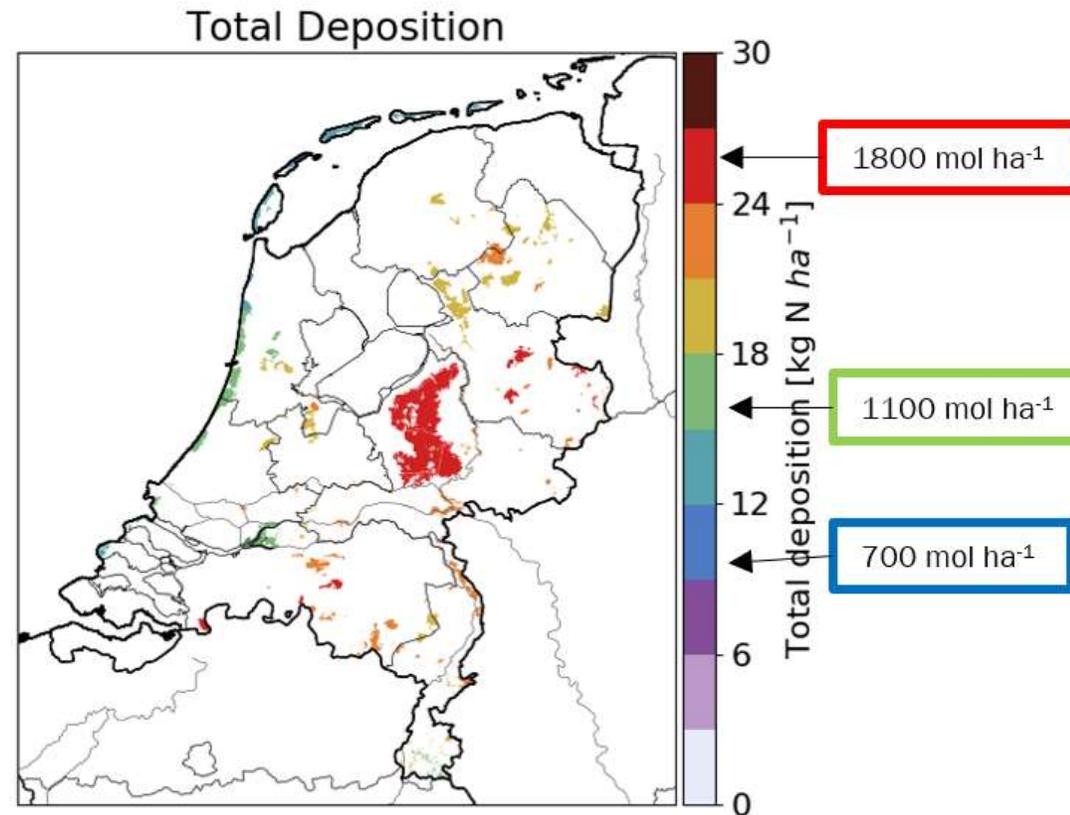
M. Van Damme, L. Clarisse | ULB

H. Eskes | KNMI

And many more

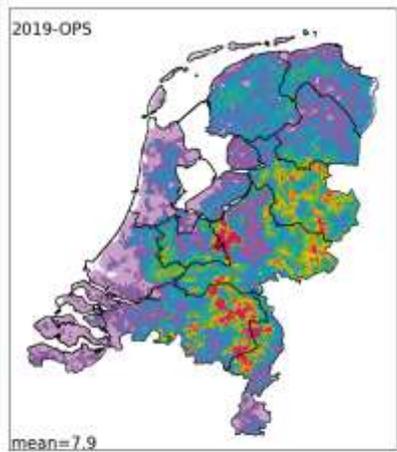


Introduction - The Nitrogen Problem

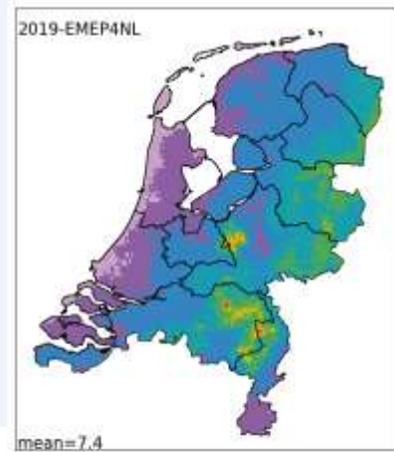


Introduction – Modelling Nitrogen Deposition

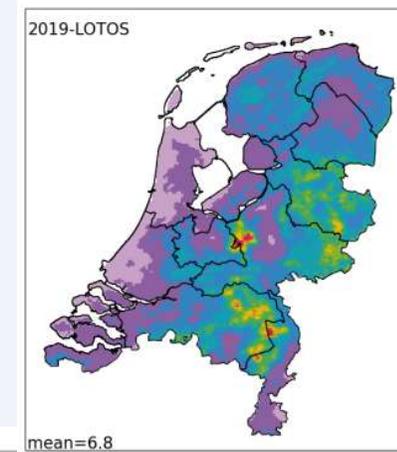
WIP



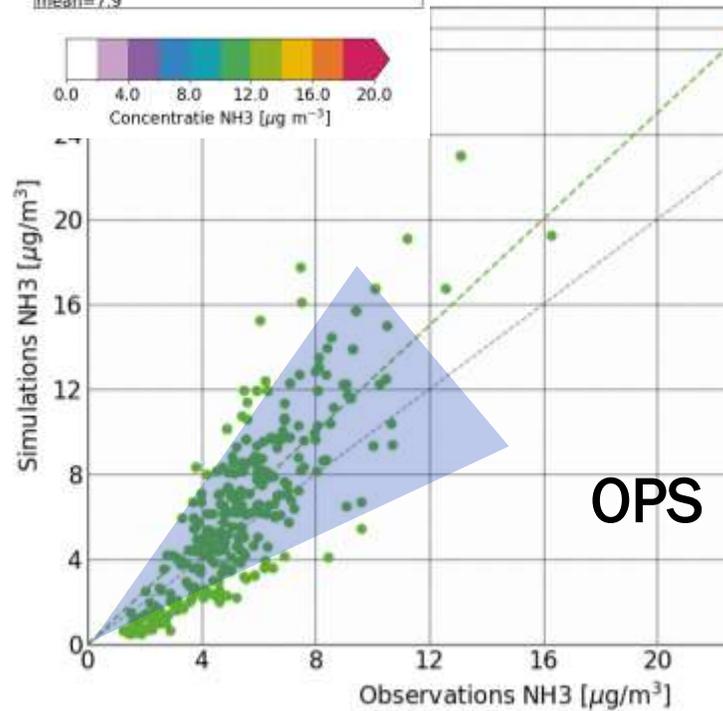
All three models show an overestimation in the east



At the same time give an underestimation in the west

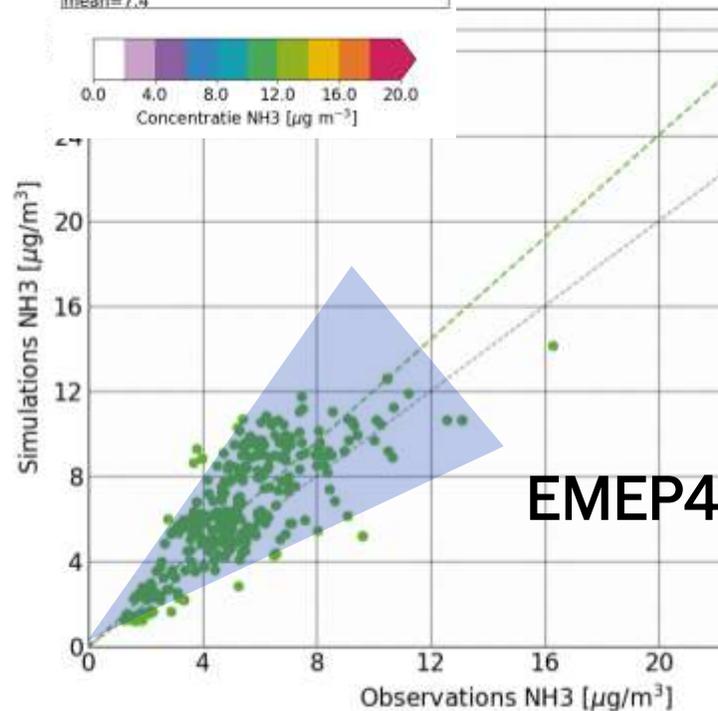


Note that most of the MAN locations are within Natura 2000 zones, away from the hotspots



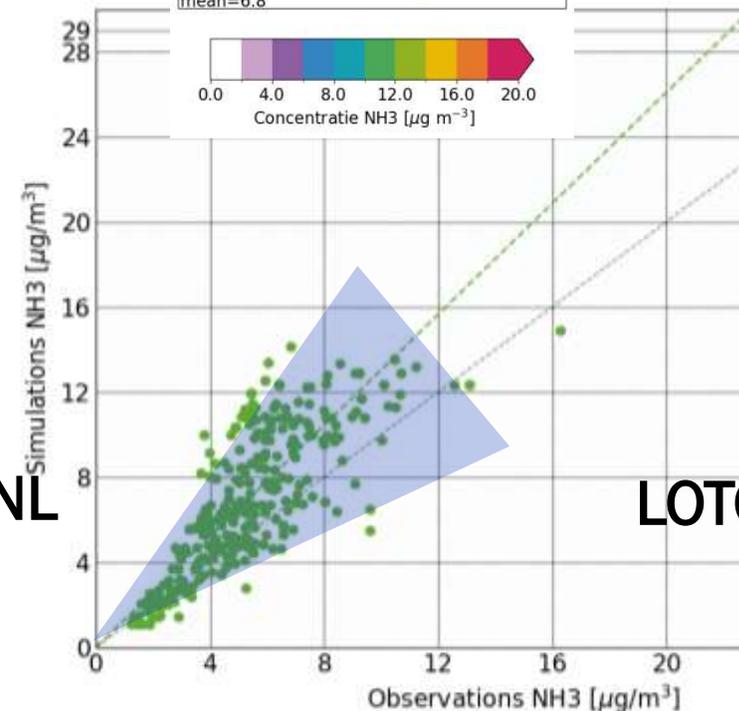
OPS

OPS; $y=1.25x$



EMEP4NL

EMEP4NL; $y=1.20x$



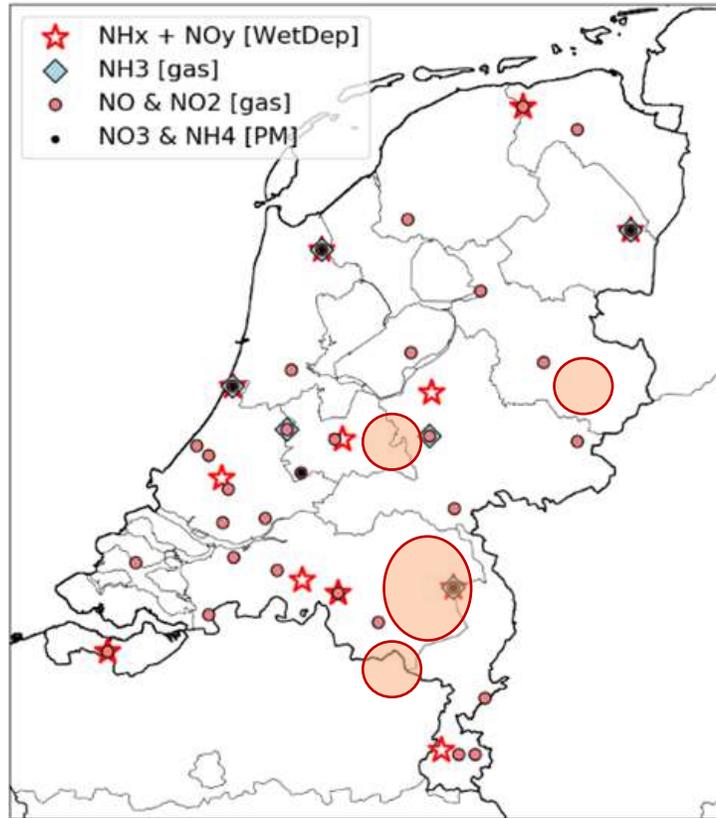
LOTOS-EUROS

LOTOS; $y=1.30x$

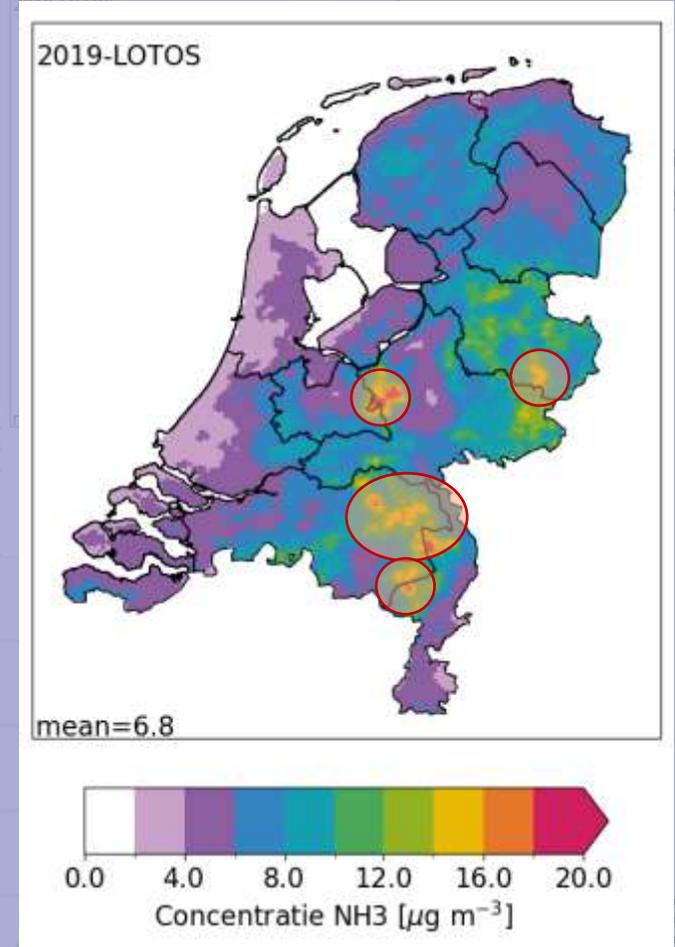
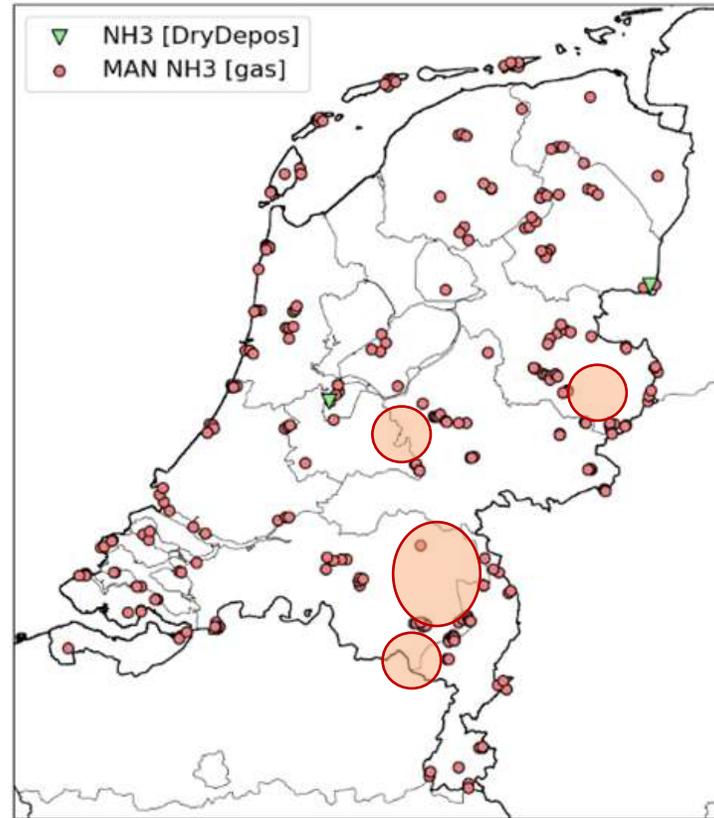
NKS

Introduction – Modelling Nitrogen Deposition

› LML (Hourly)



› MAN & COTAG (monthly)



Simulations NH3 [µg/m³]

mean=2

0.0

20

16

12

8

4

0

Observations NH3 [µg/m³]

• OPS; $y=1.25x$

Observations NH3 [µg/m³]

• EMEP4NL; $y=1.20x$

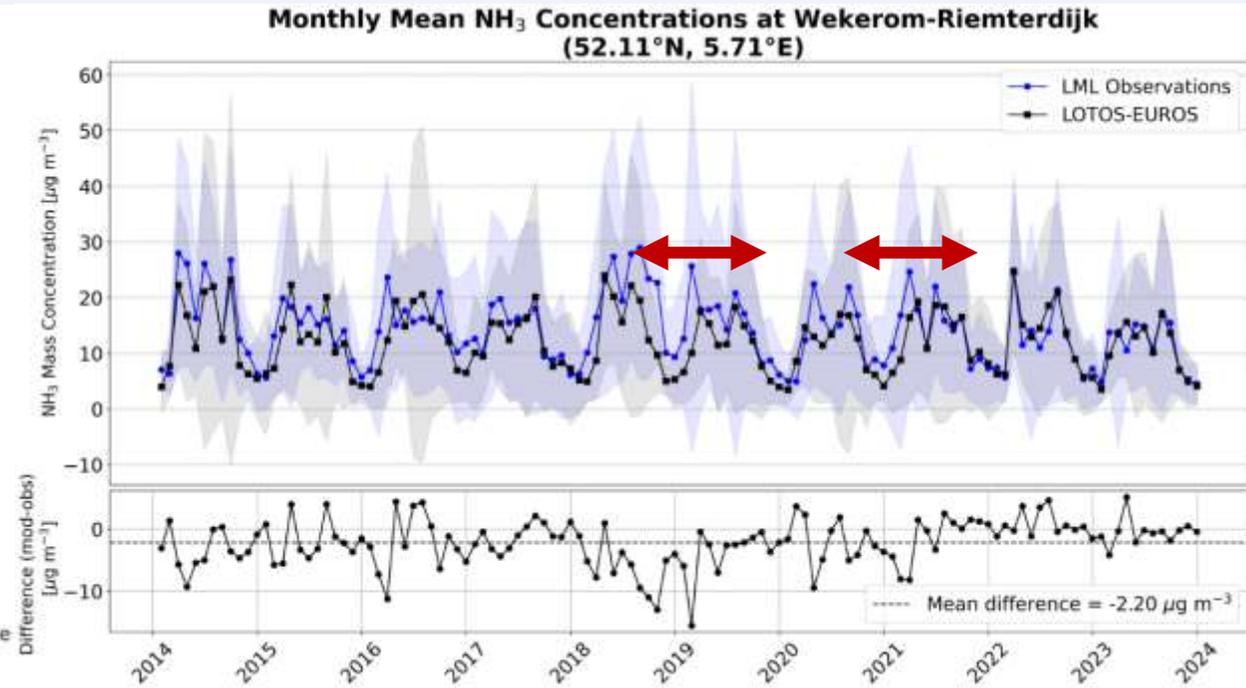
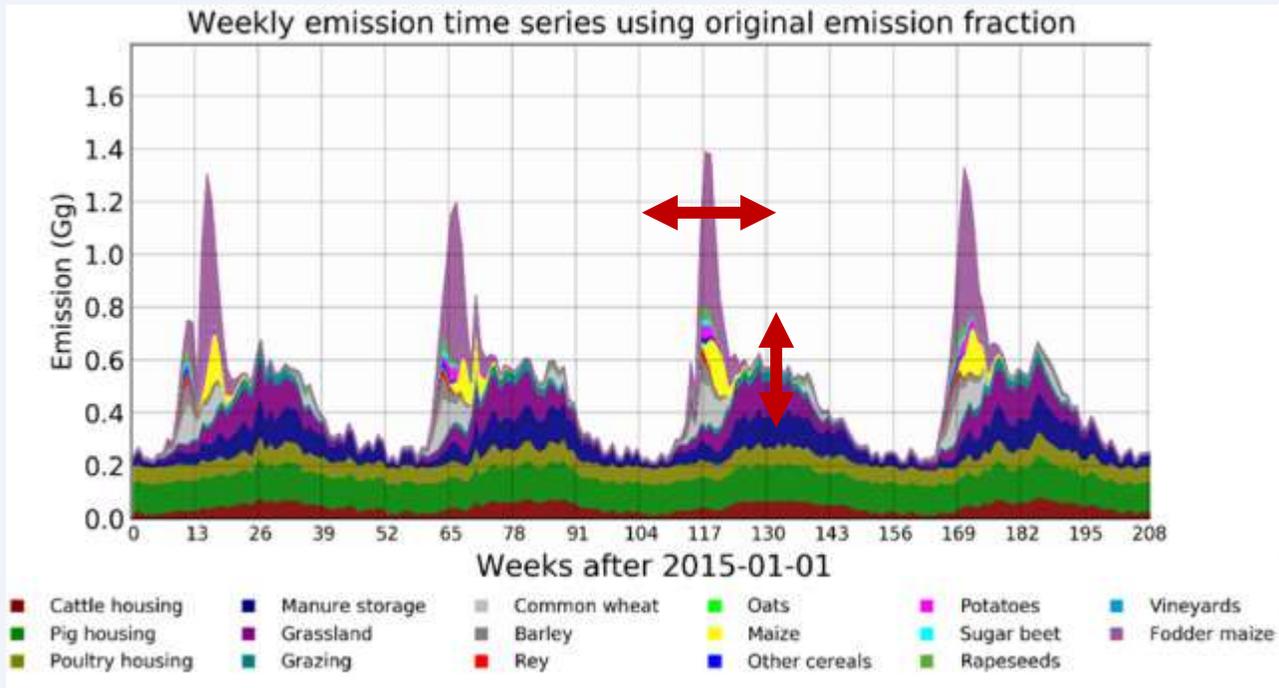
Observations NH3 [µg/m³]

• LOTOS; $y=1.30x$

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Introduction – Modelling Nitrogen Deposition

WIP



So what role can satellites play?

Introduction – NKS

Project NKS/SAGEN

Project ministry LNV: 4 years

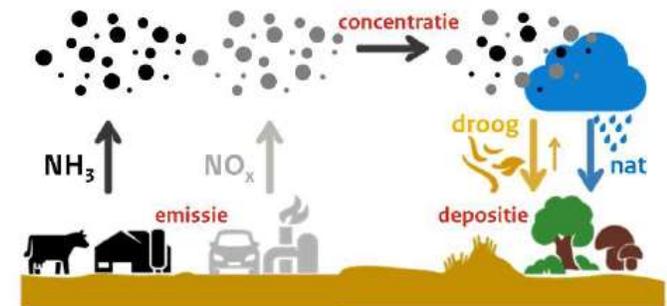
Goal

- Investigation of the possibilities of the use of **satellite data** and **ensemble modelling** for improving models for nitrogen deposition

Over arching goals

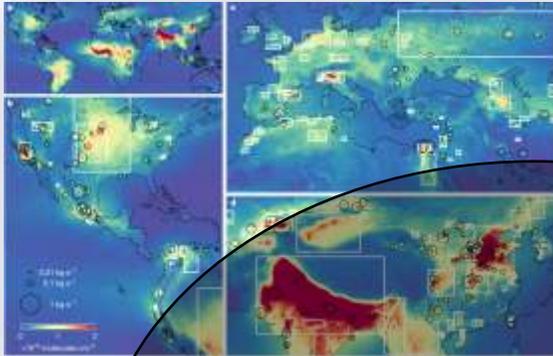
- Improve knowledge nitrogen deposition and modelling
- Collaboration in NL
- Sharing knowledge
- Improve transparency and support base

Scientific research: AIO, postdocs, publications

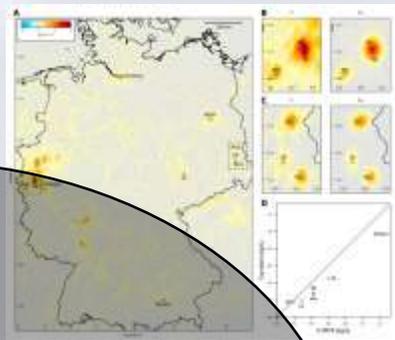


Introduction – Methods for emission estimates

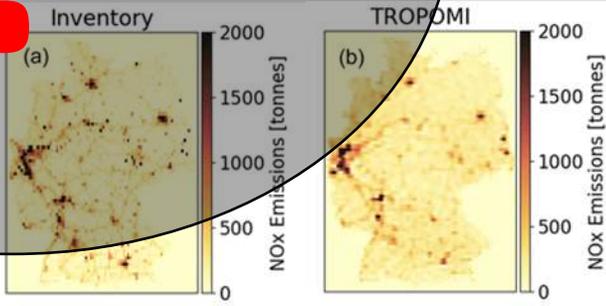
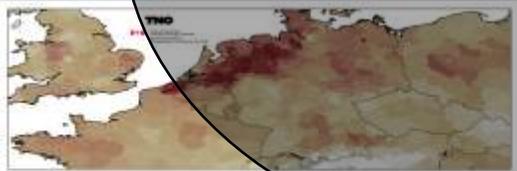
Mass-balance & plume-based methods



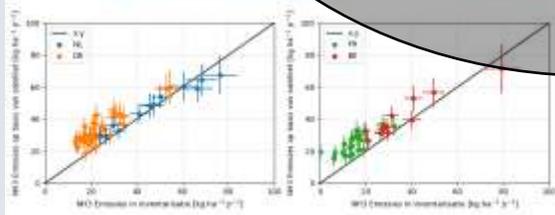
Van Damme et al., 2018 – NH3



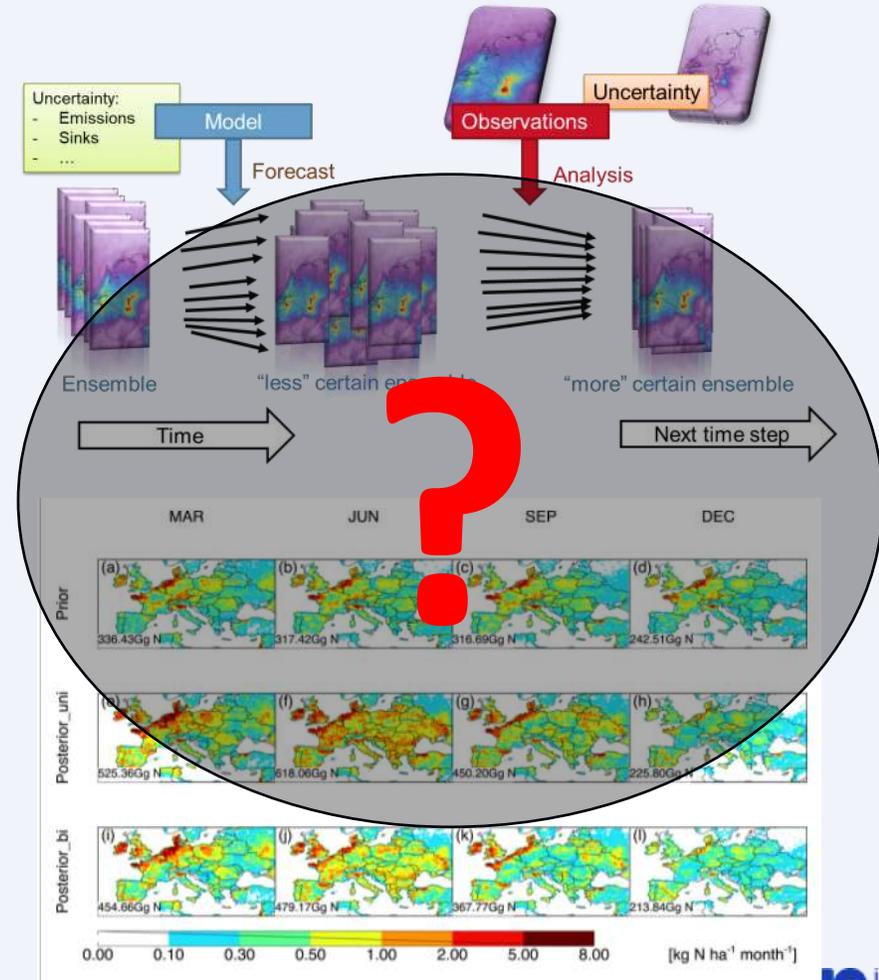
Beirle et al., 2019 – NO2



Dammers et al., 2024 – NO2



LETKF / 4D-EnVar etc methods



Cao et al., 2022 – NH3

Introduction – Local Ensemble Transform Kalman Filter

Important parameters (current “*optimum*” for system):

Temporal correlation

NH₃: 3 days

NO_x: 1 day

Spatial correlation (gaussian)

NH₃: 15 km – IASI A+B+C (~9:30) + CrIS1+2 (~13:30)

NO₂: 5 km – TROPOMI (~13:30)

Amount of variation allowed on emissions:

Mean at 1.0 + standard deviation 0.5

Other:

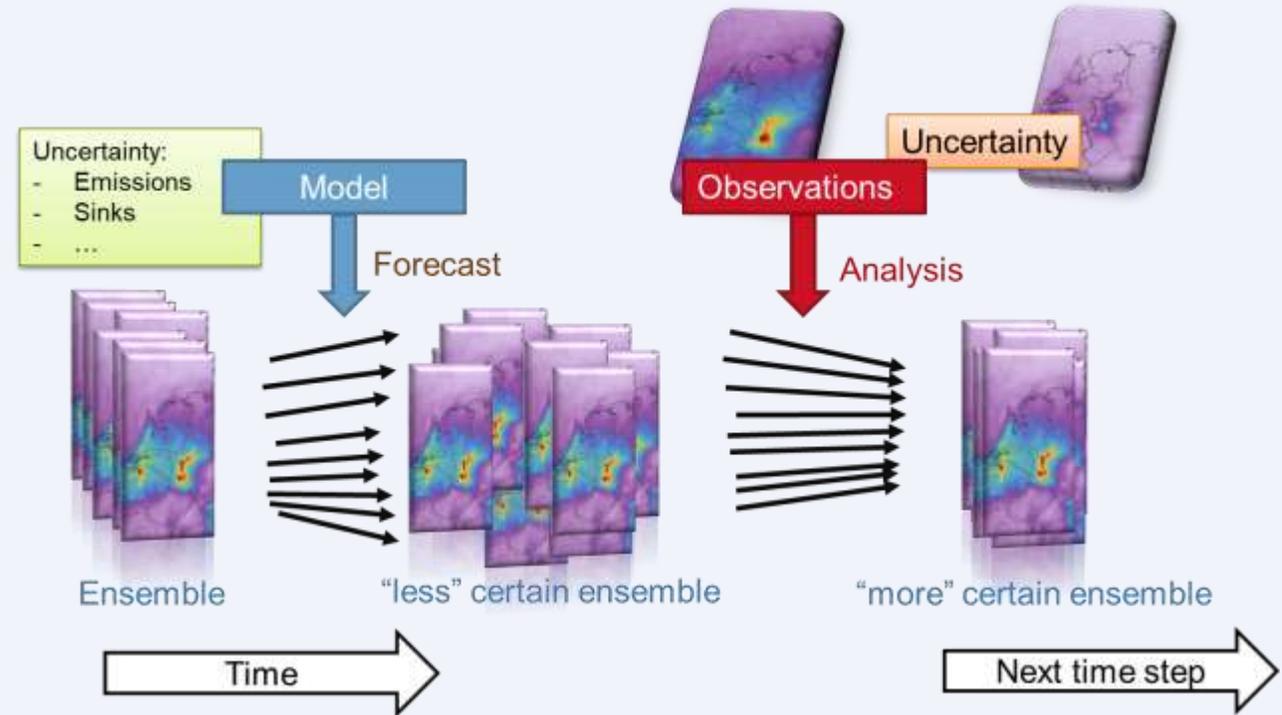
LOTOS-EUROS v2.2.003

NW Europe + Iberian Peninsula 7x7km²

Emissions: CAMS-REGv5.1 + ER (NL) + GrETa (Germany)

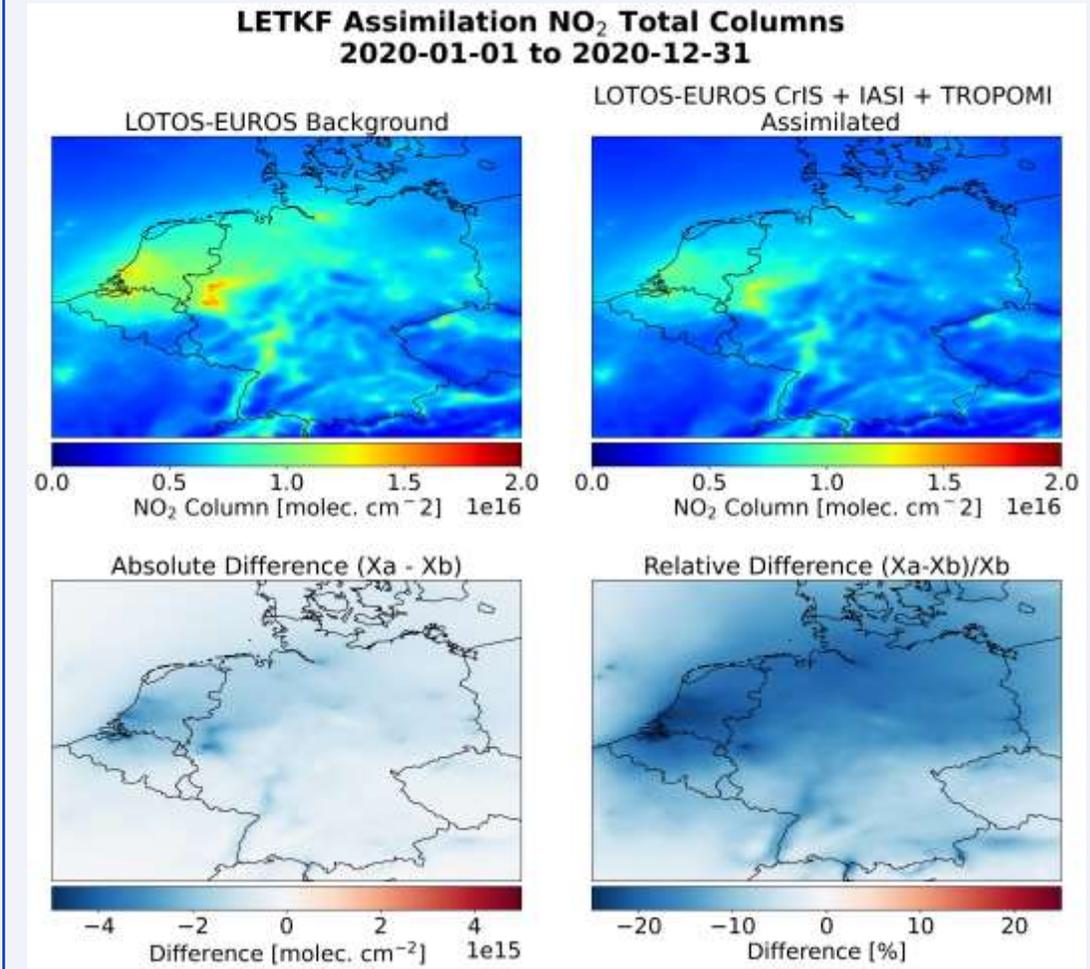
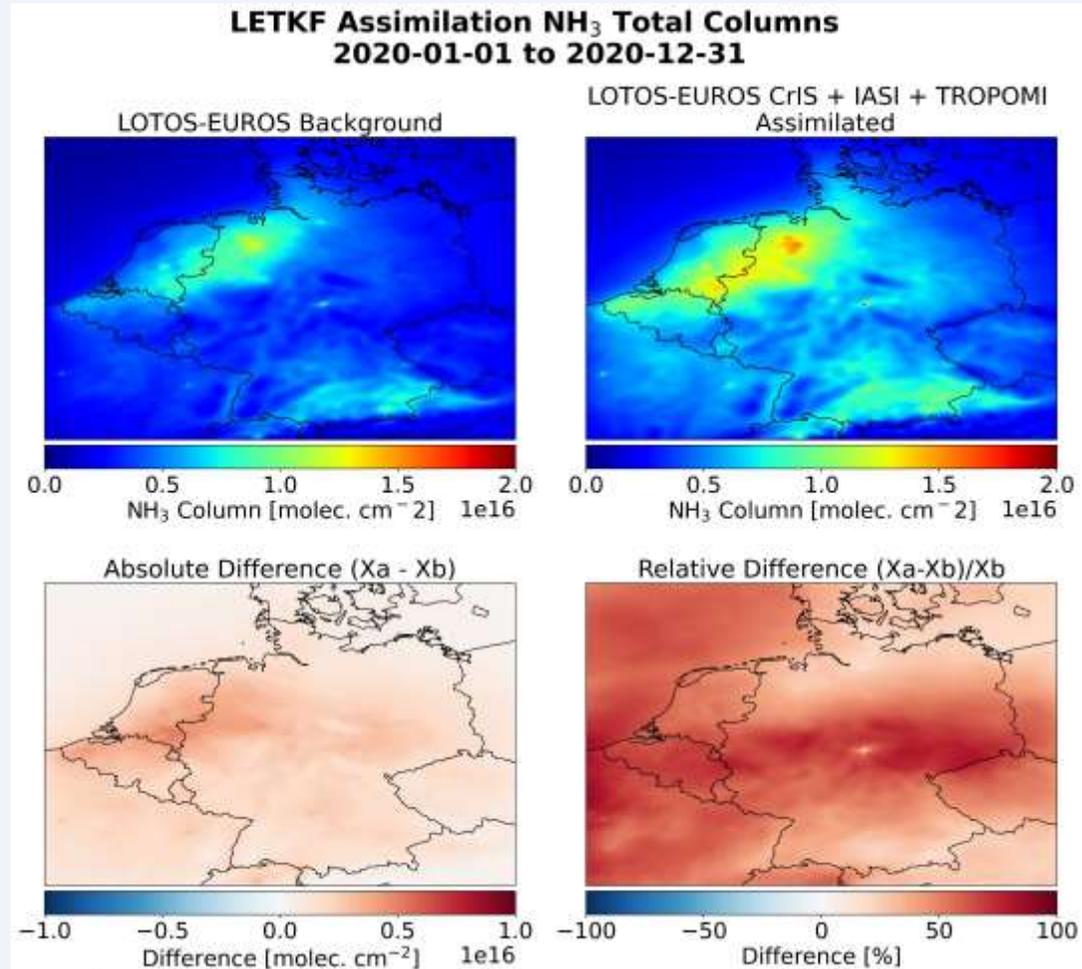
Timing: TEMPO + further detailing NH₃ temporal allocation

BC: CAMS IFS



Results – Column level changes + emission totals

	NL-base	NL-LETKF	GER-base	GER-LETKF
NH ₃	124kt	150kt	574kt	695kt
NO _x	258kt	187kt	1216kt	1046kt

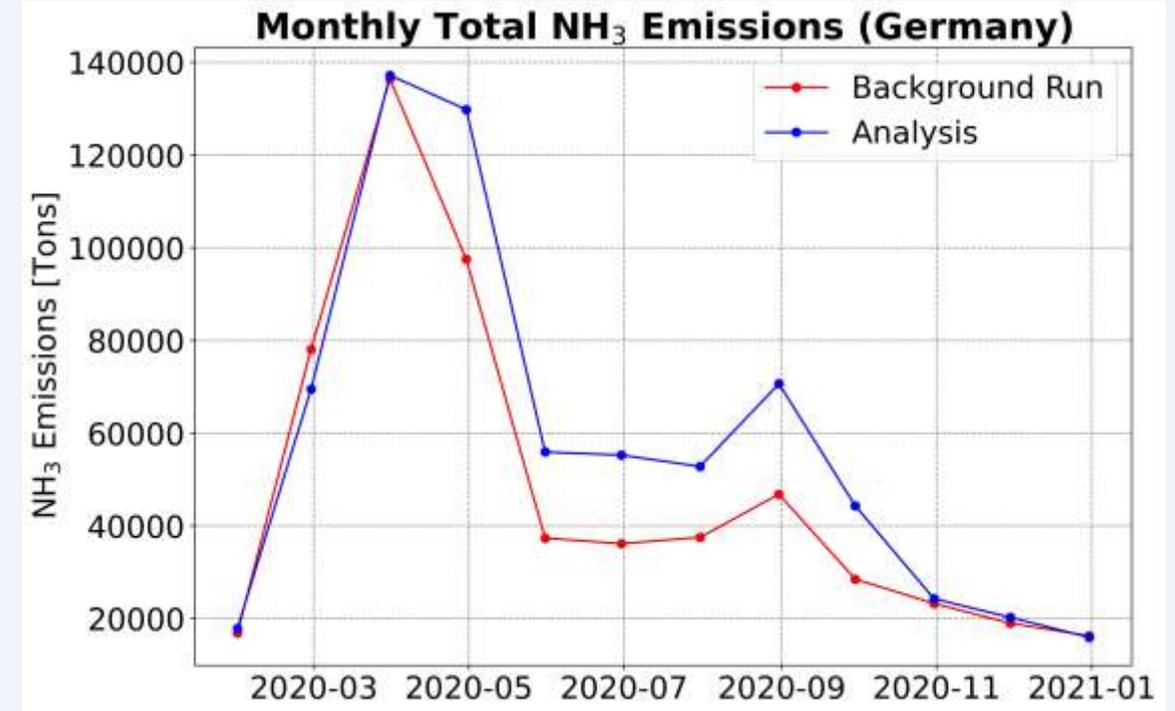
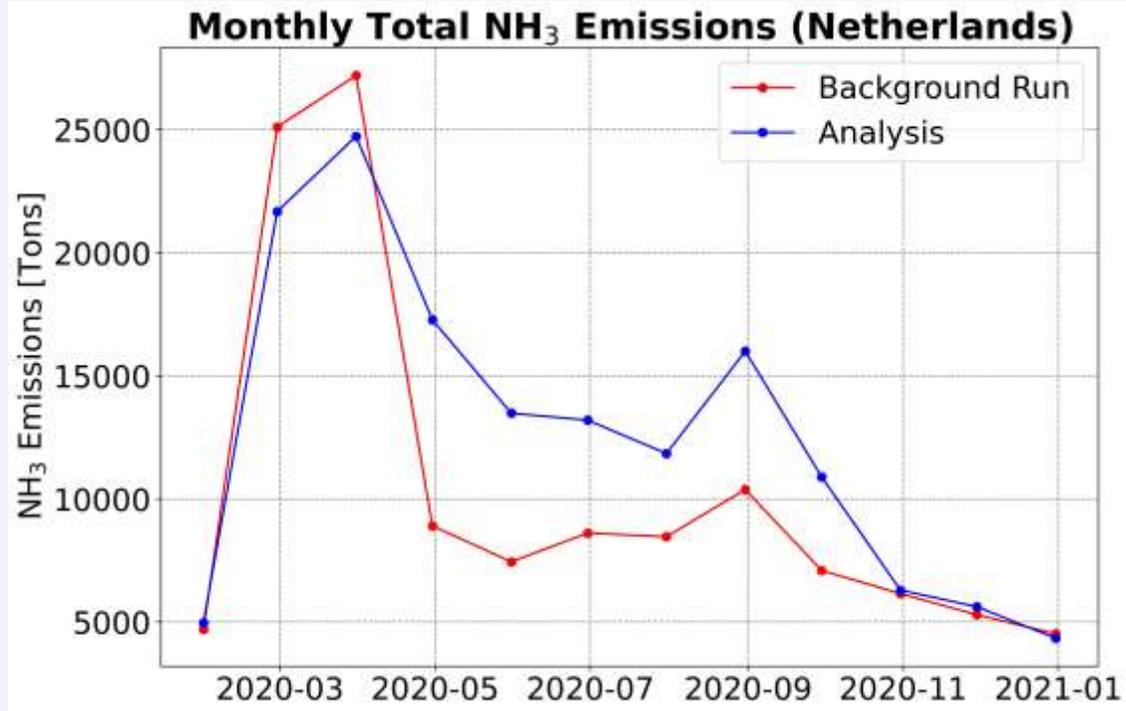


2020 NO_x: COVID restrictions + overall decreasing in NO_x over last decade – Lower emissions

2020 NH₃: Higher than average temperatures, exceptional sunny Spring + longer lifetimes decreasing NO_x/HNO₃

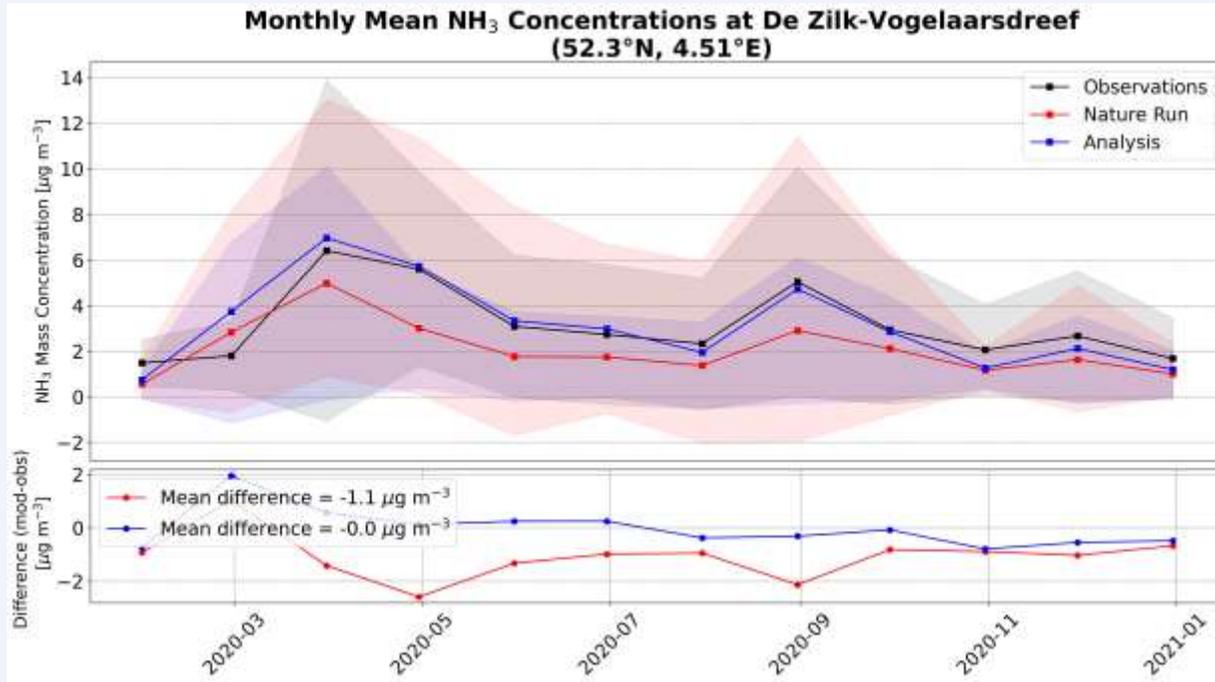


Results – Monthly emission totals

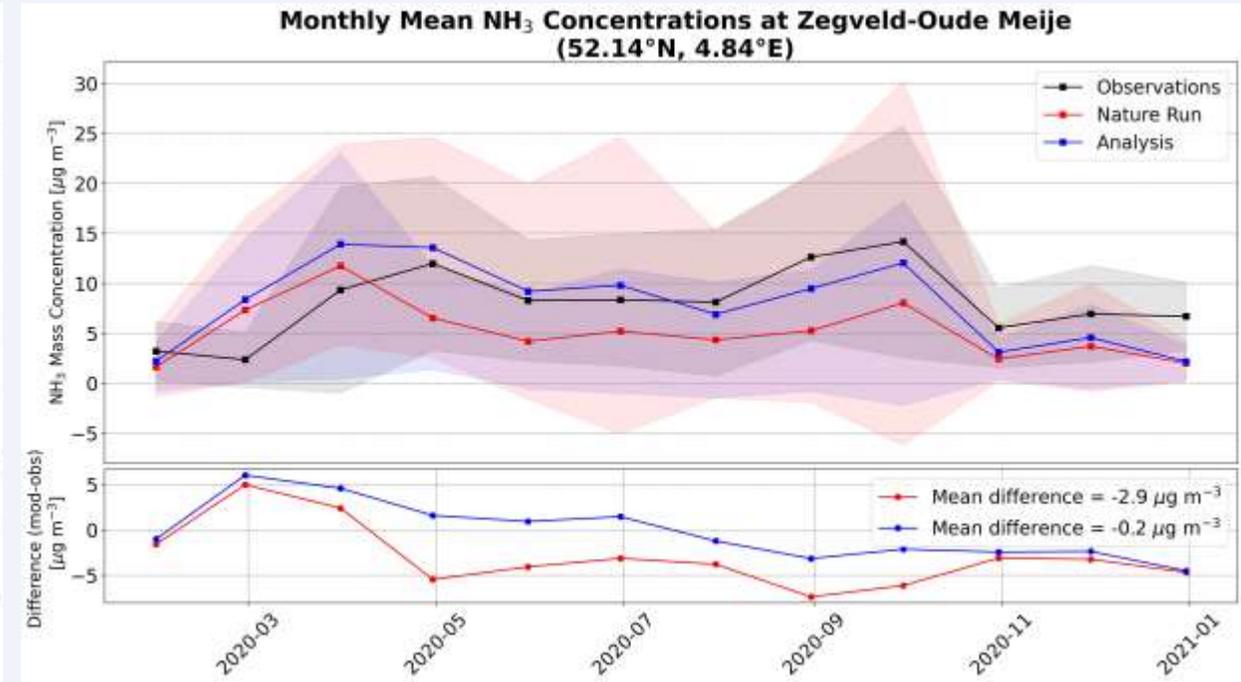


Shift from spring emissions to summer. Higher total emissions, as expected from increased temperatures, increasing volatilization of NH₃

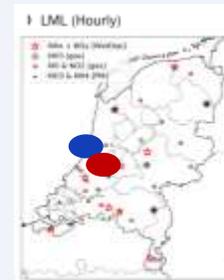
Results – Surface Concentrations – Temporal



Coastal



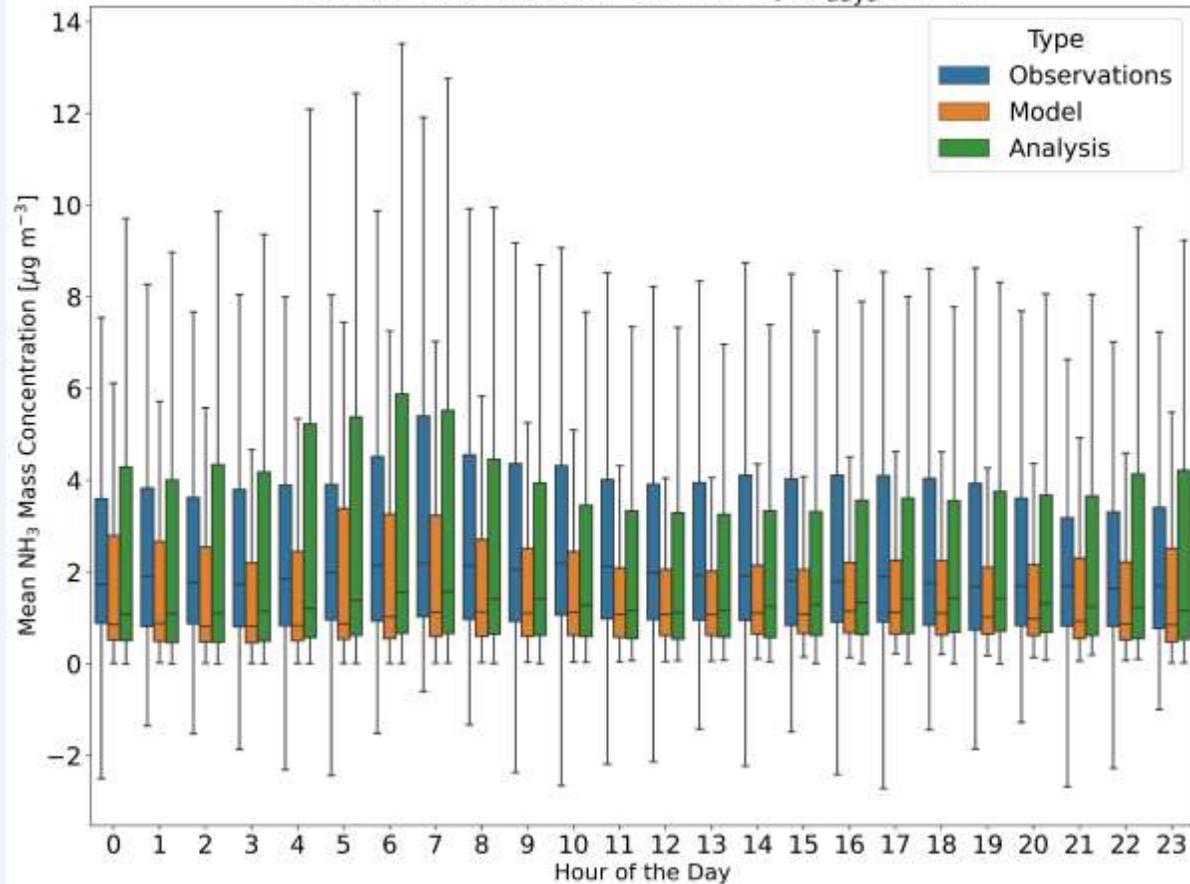
Inland



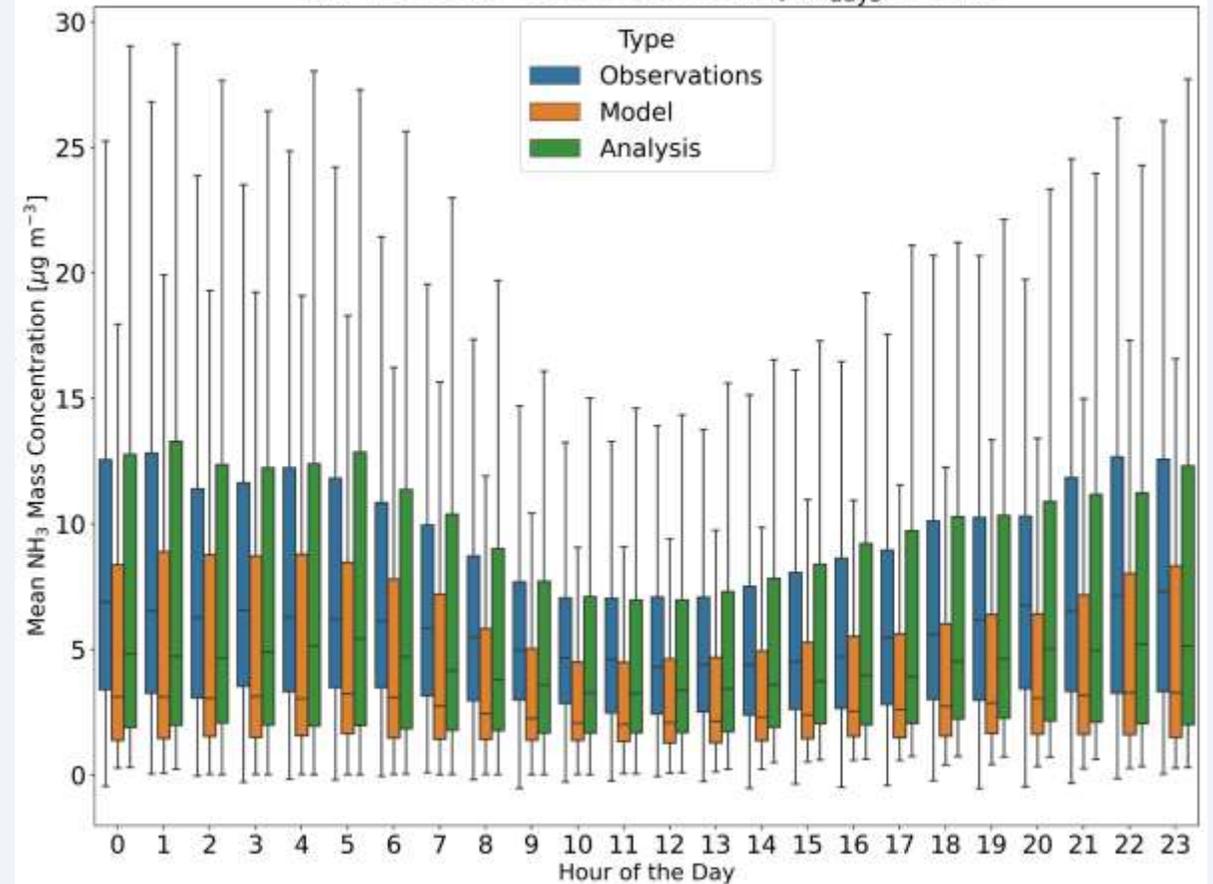
Large improvement in Mean Bias
 Seasonal cycle generally well captured
 Differences in winter months / early spring (Zegveld)

Results – Surface Concentrations – Diurnal

De Zilk-Vogelaarsdreef (52.3°N, 4.51°E)
01-01-2020 to 30-12-2020, N_{days} = 355



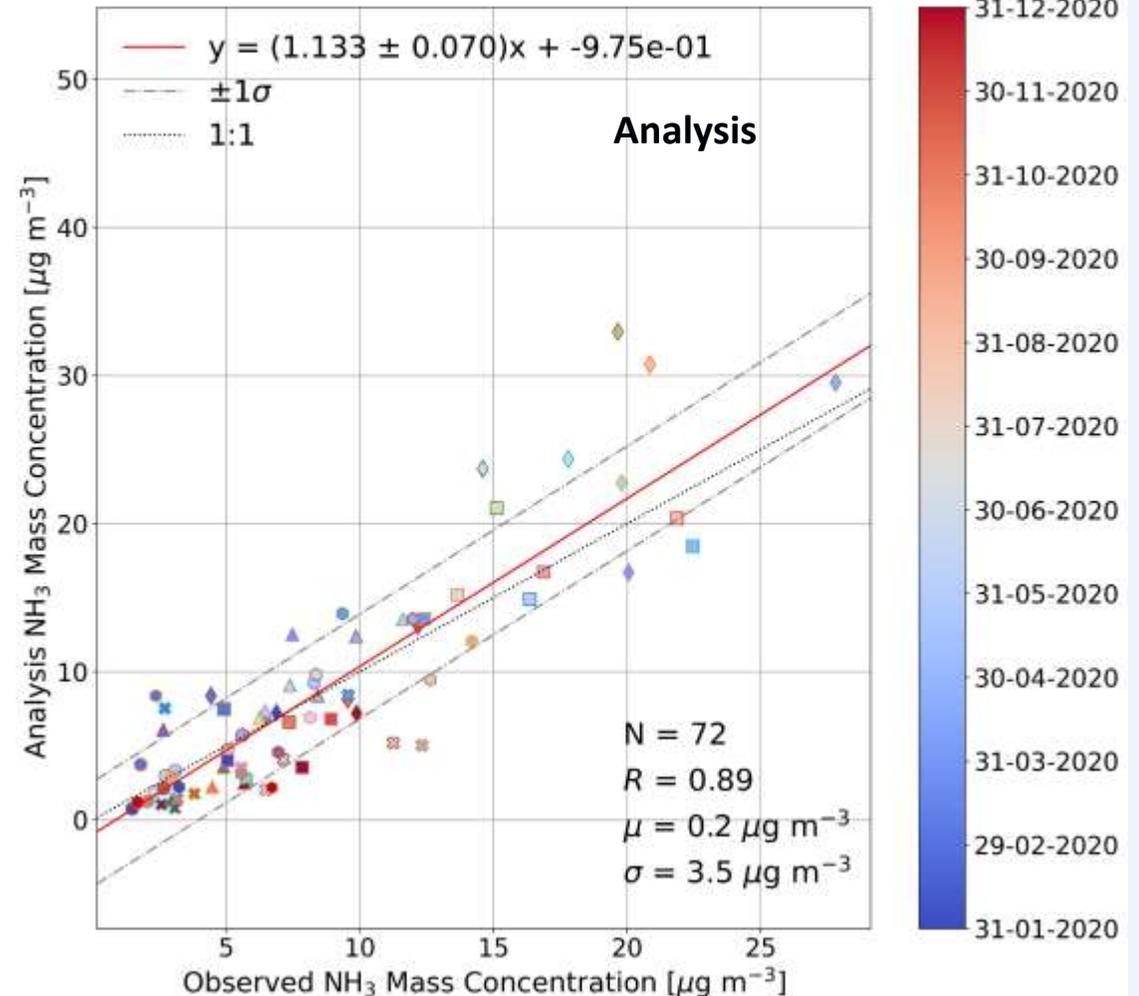
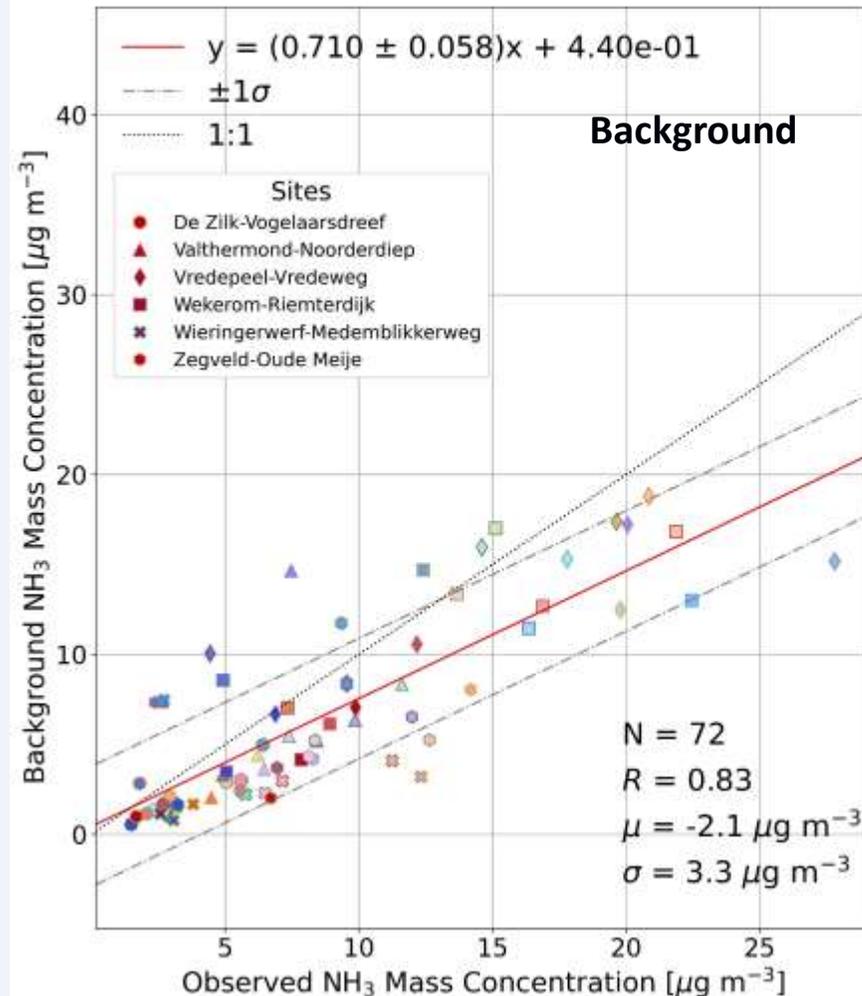
Zegveld-Oude Meije (52.14°N, 4.84°E)
01-01-2020 to 30-12-2020, N_{days} = 326



Improvement on diurnal cycle of NH₃, even though only morning/early afternoon overpasses were used
Mean of the observations still shows a difference

Results – NH₃ Surface Concentrations – Temporal

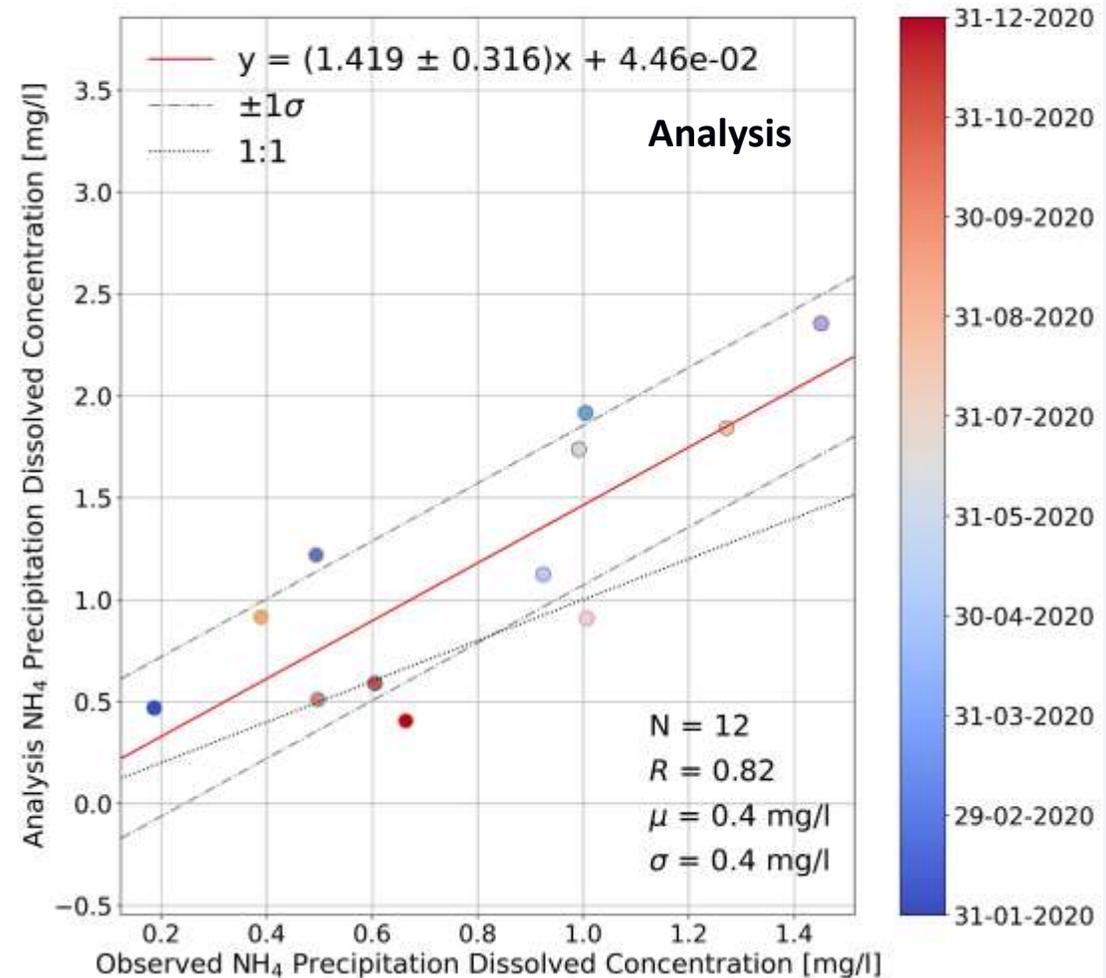
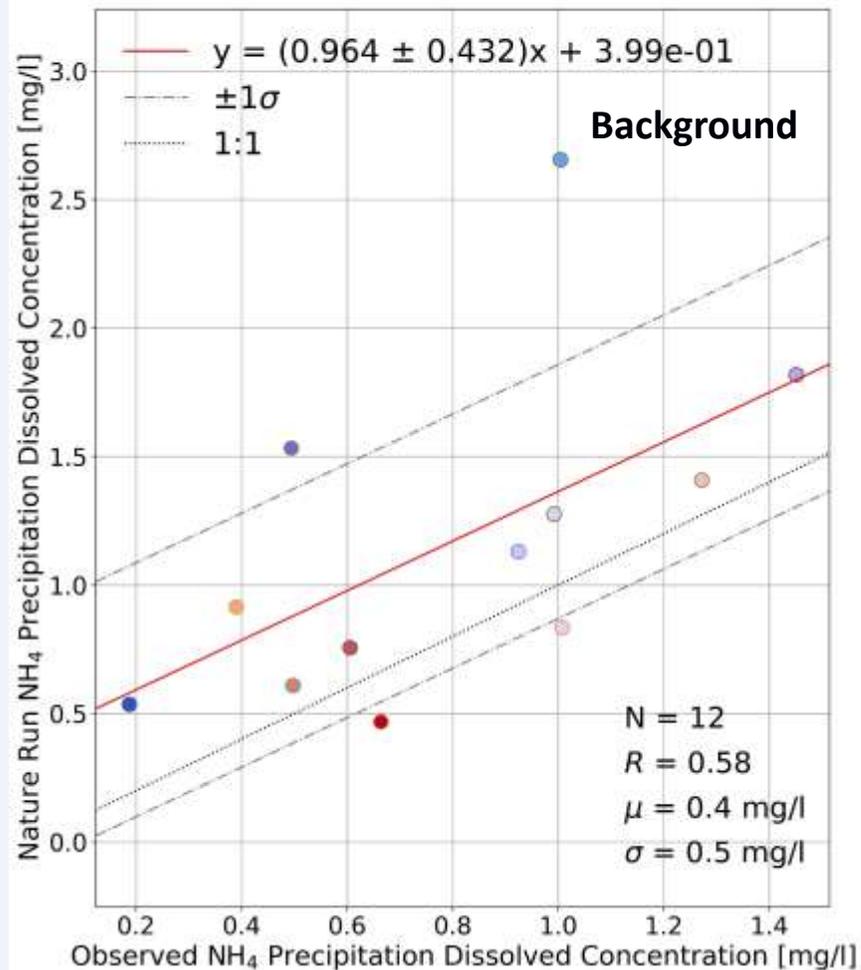
Monthly Temporal Mean Ground-based vs. Modeled
NH₃ Concentrations (N_{sites} = 6)



Monthly averages for all sites show broad improvement in surface NH₃ concentrations.

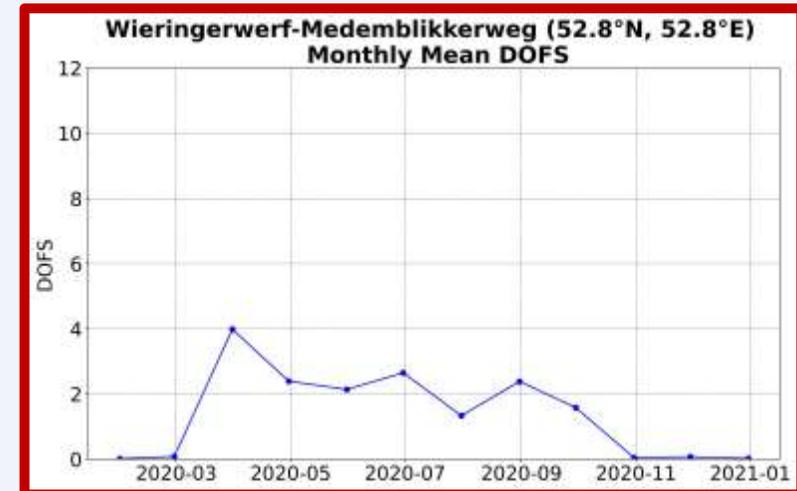
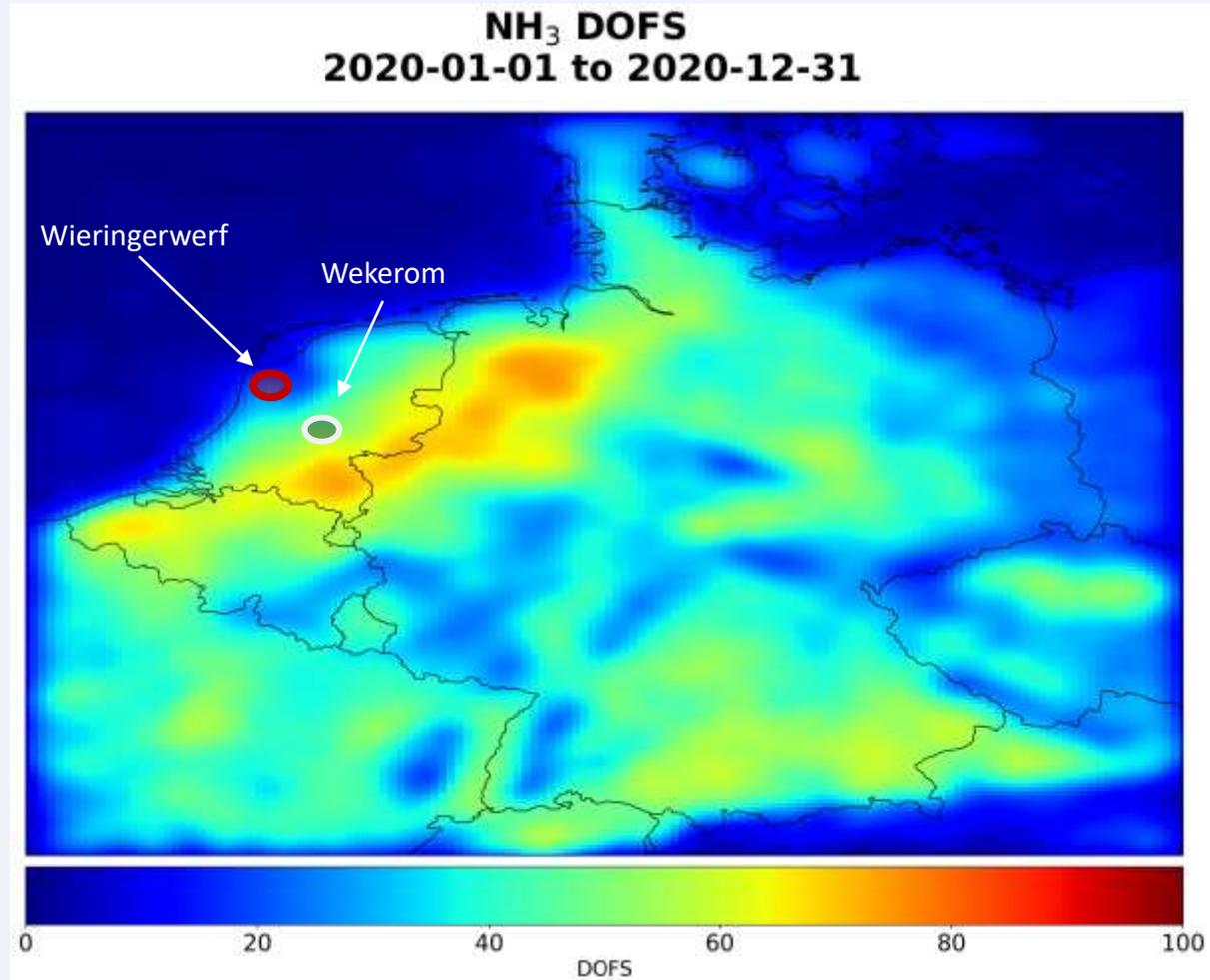
Results – NH₄⁺ Wet Deposition – Spatial

Monthly Spatial Mean Ground-based Obs. vs. Modeled
NH₄ Precipitation Concentrations (N_{sites} = 8)



Temporal means of NH₄⁺ wet deposition did not show large differences, but the spatial means show a notable improvement in the correlations.

Results – Degrees of Freedom



Limitation to available information at locations right on the coast & islands due to lack of observations.

Positive: Even in worst case, satellite still provides a solid 2 bits of information (summer/spring), (e.g. comparable to >2 passive samplers)



Conclusions

- Co-assimilated IASI & CrIS NH_3 + TROPOMI- NO_2 .
- LETKF able to pick up on “limited” shifts in emissions timing and level.
- Strong improvements compared to hourly observations (LML).
- Limited value in coastal / island regions / wintertime (low NH_3 anyway).
- Limited impact of co-assimilating with NO_2 (region is not NH_3 limited) – few co-emitting species.

Outlook

- Full OSSE underway to understand the actual performance of the system in detail.
- Further validation with in-situ deposition and monthly samplers data to be added.
- Future comparison to other inversion methods for trade off study between the various satellite estimates methods.
- Work on LETKF analysis of Iberian peninsula by Daniel Helm from University of Aveiro.



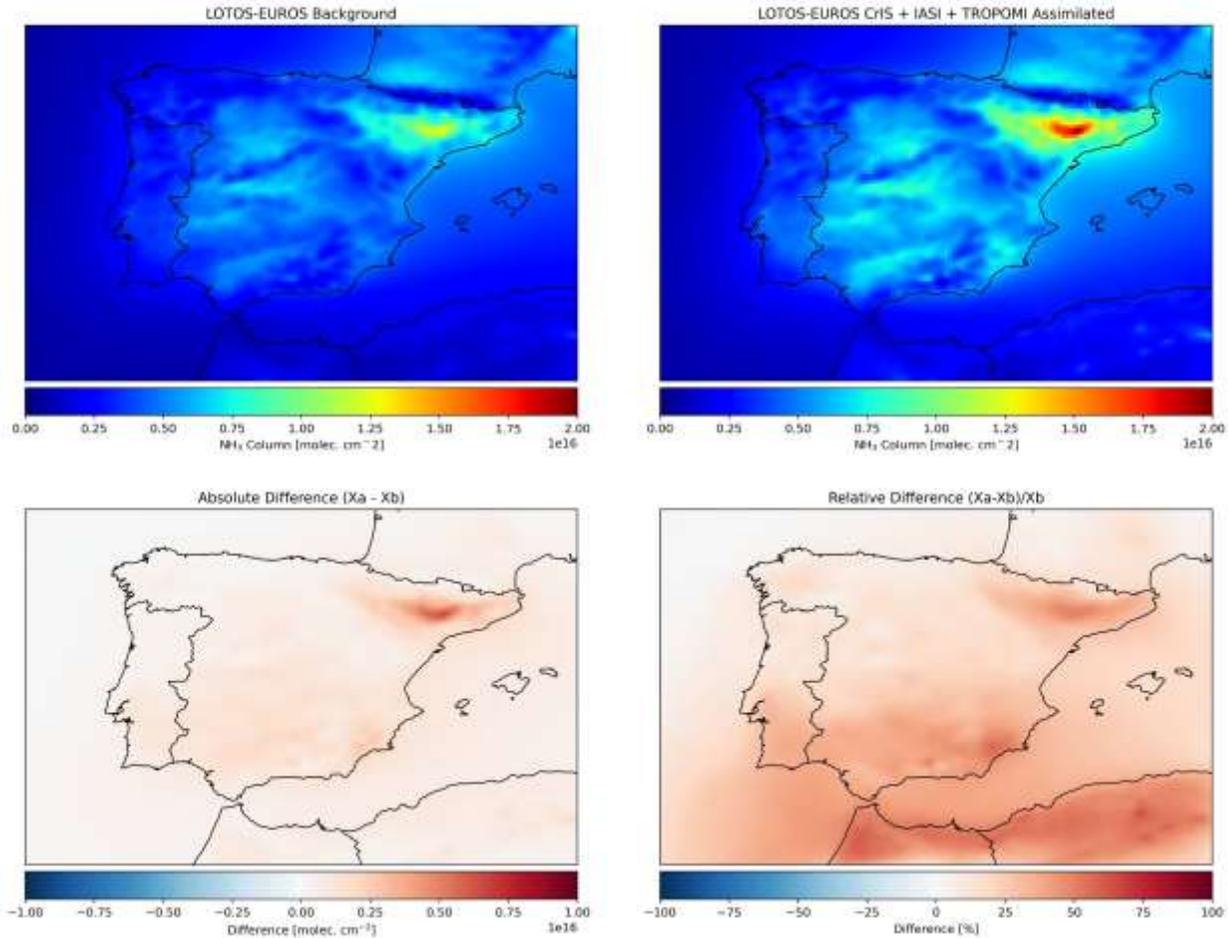
Questions?

Contact:
Tyler.Wizenberg@tno.nl

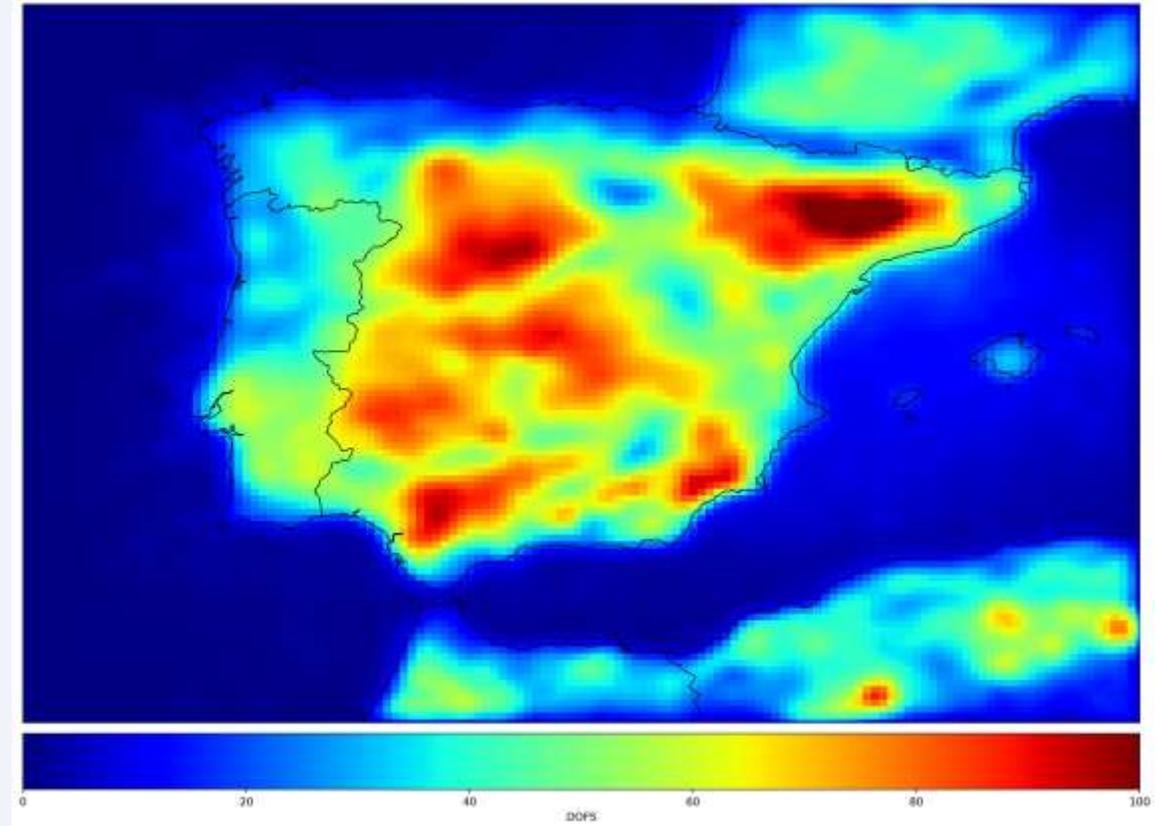


Results – Iberian Peninsula

LETKF Assimilation NH_3 Total Columns
2020-01-01 to 2020-12-31



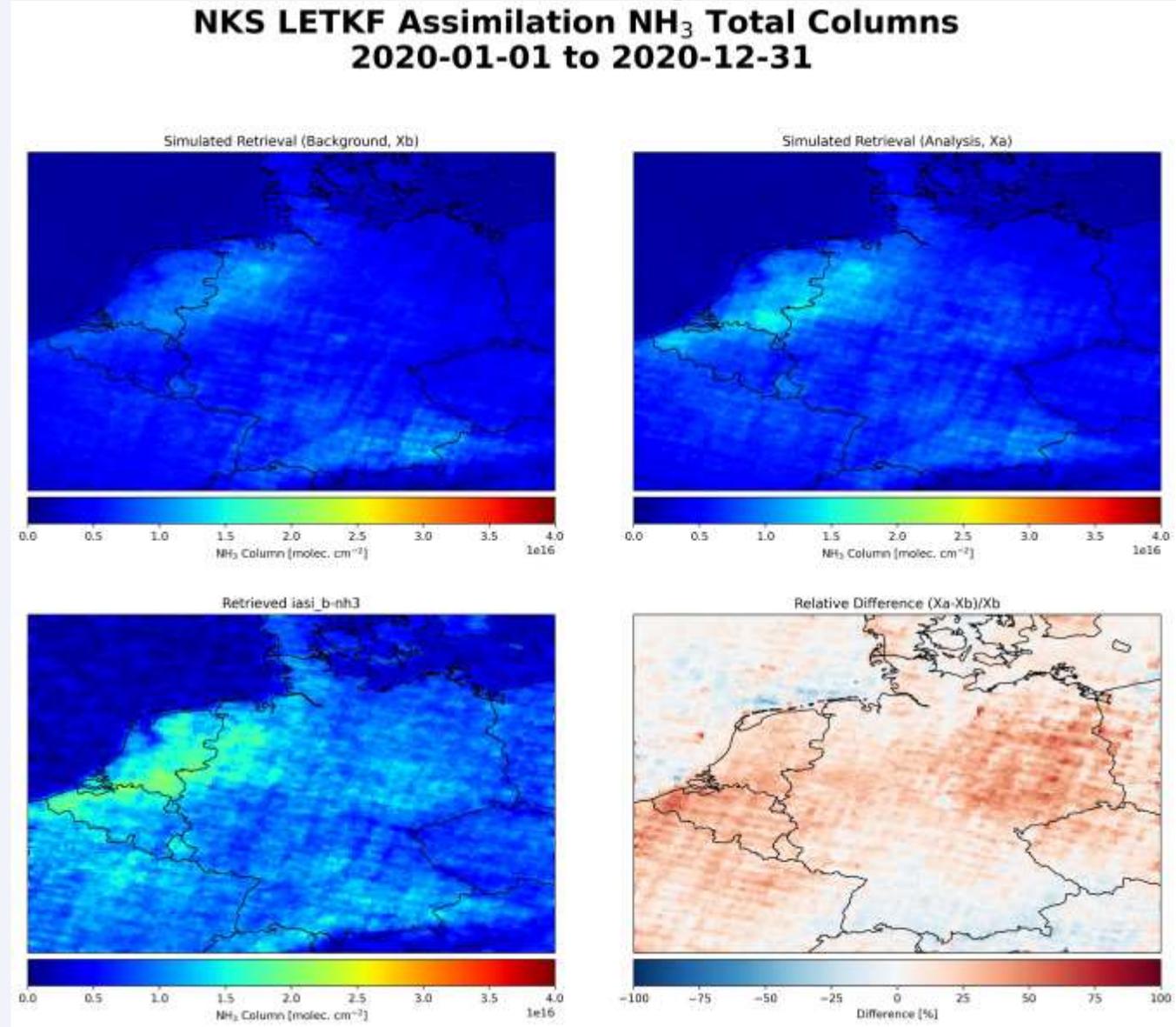
NH_3 DOFS
2020-01-01 to 2020-12-31



LETKF not good at completely missing emissions, needs a base to adjust, limited impact on Portugal

Future work by Daniel Helm within FONDA

Results – Column level changes + emission totals



2020 NO_x: COVID restrictions + overall decreasing in NO_x over last decade – Lower emissions
2020 NH₃: Higher than average temperatures, exceptional sunny Spring + longer lifetimes decreasing NO_x/HNO₃

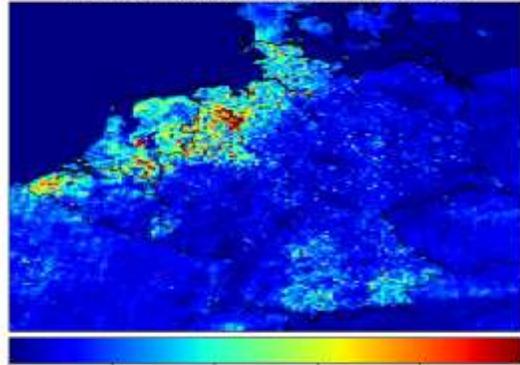
Results – Emission changes + emission totals

	NL-base	NL-LETKF	GER-base	GER-LETKF
NH ₃	124kt	150kt	574kt	695kt
NO _x	258kt	187kt	1216kt	1046kt

**NKS LETKF Assimilation NH₃ Emissions
2020-01-01 to 2020-12-31**

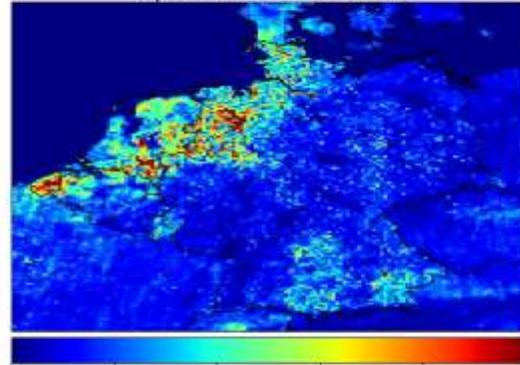
**NKS LETKF Assimilation NO₂ Emissions
2020-01-01 to 2020-12-31**

LOTOS-EUROS Base Emissions



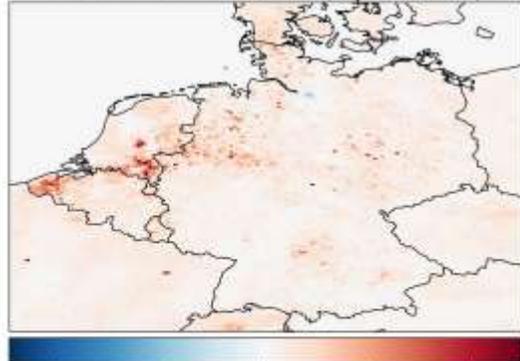
0.000 0.002 0.004 0.006 0.008 0.010
Total NH₃ Emissions [kg m⁻²]

LOTOS-EUROS CrIS + IASI + TROPOMI
Optimized Emissions



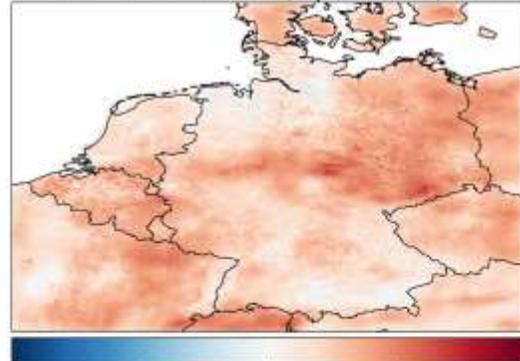
0.000 0.002 0.004 0.006 0.008 0.010
Total NH₃ Emissions [kg m⁻²]

Absolute Difference (Opt - Base)



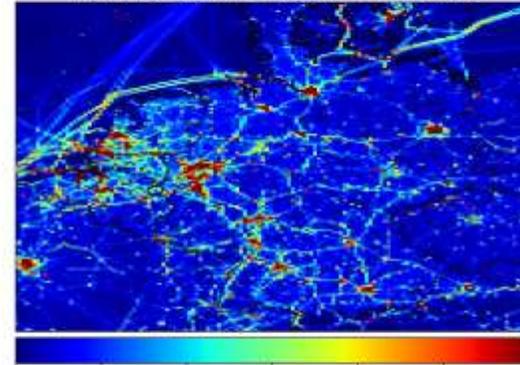
-0.004 -0.002 0.000 0.002 0.004
Difference [kg m⁻²]

Relative Difference (Opt - Base)/Base



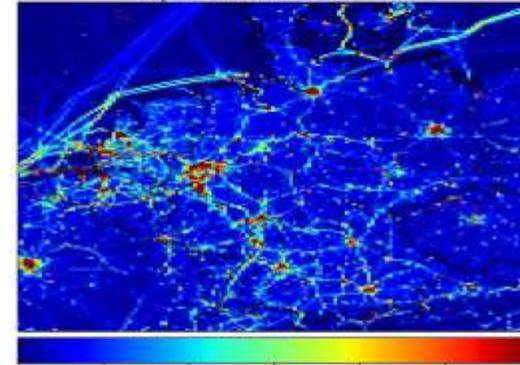
-100 -50 0 50 100
Difference [%]

LOTOS-EUROS Base Emissions



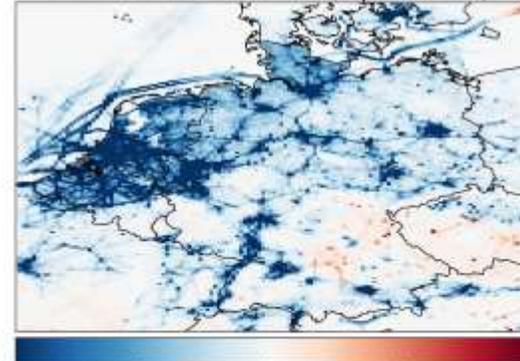
0.0000 0.0025 0.0050 0.0075 0.0100 0.0125 0.0150
Total NO_x (NO₂ weight) Emissions [kg m⁻²]

LOTOS-EUROS CrIS + IASI + TROPOMI
Optimized Emissions



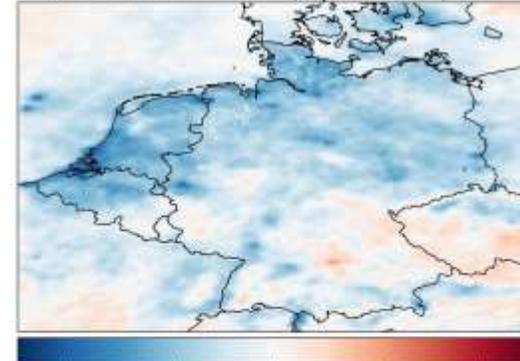
0.0000 0.0025 0.0050 0.0075 0.0100 0.0125 0.0150
Total NO_x (NO₂ weight) Emissions [kg m⁻²]

Absolute Difference (Opt - Base)



-0.0010 -0.0005 0.0000 0.0005 0.0010
Difference [kg m⁻²]

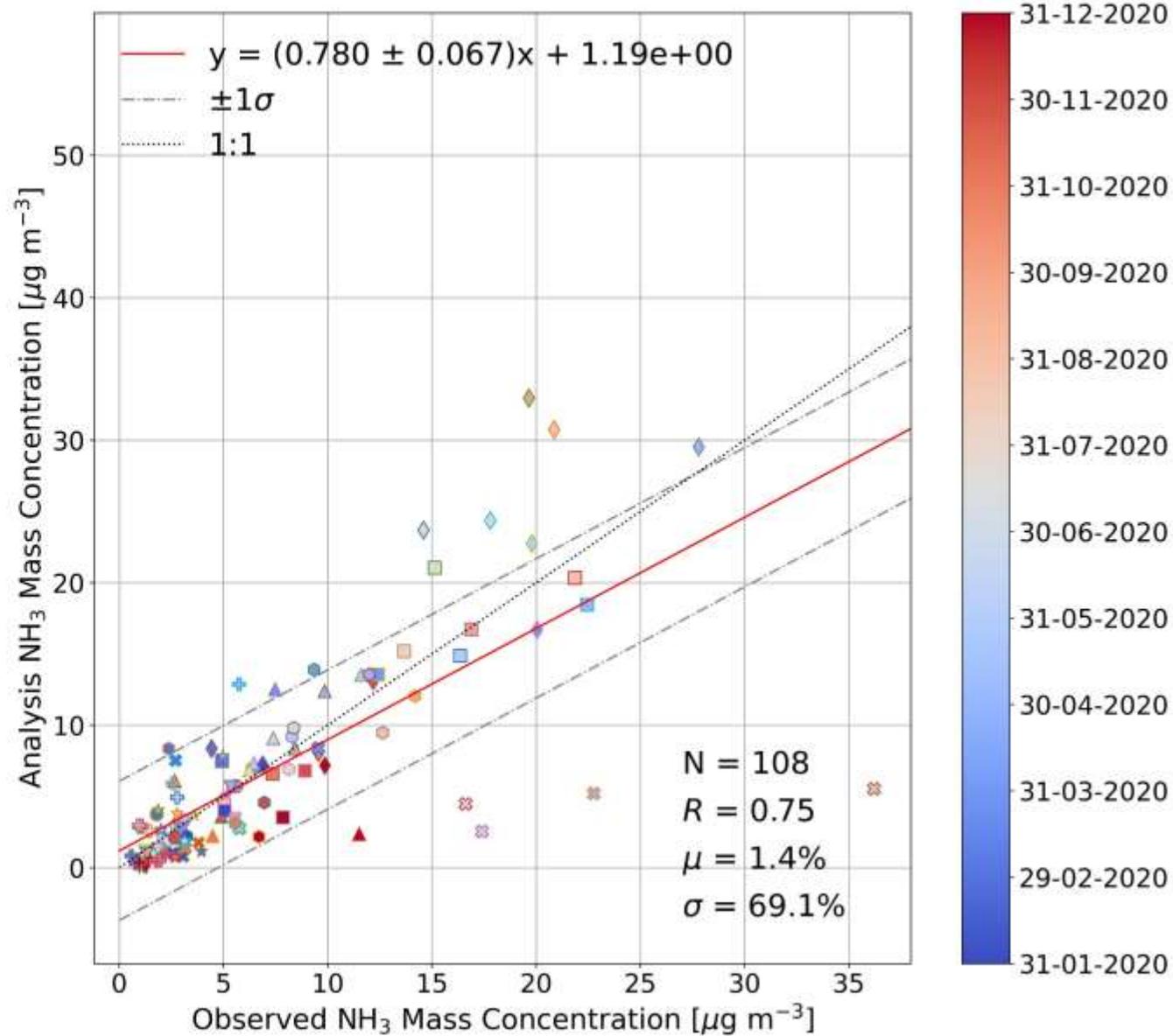
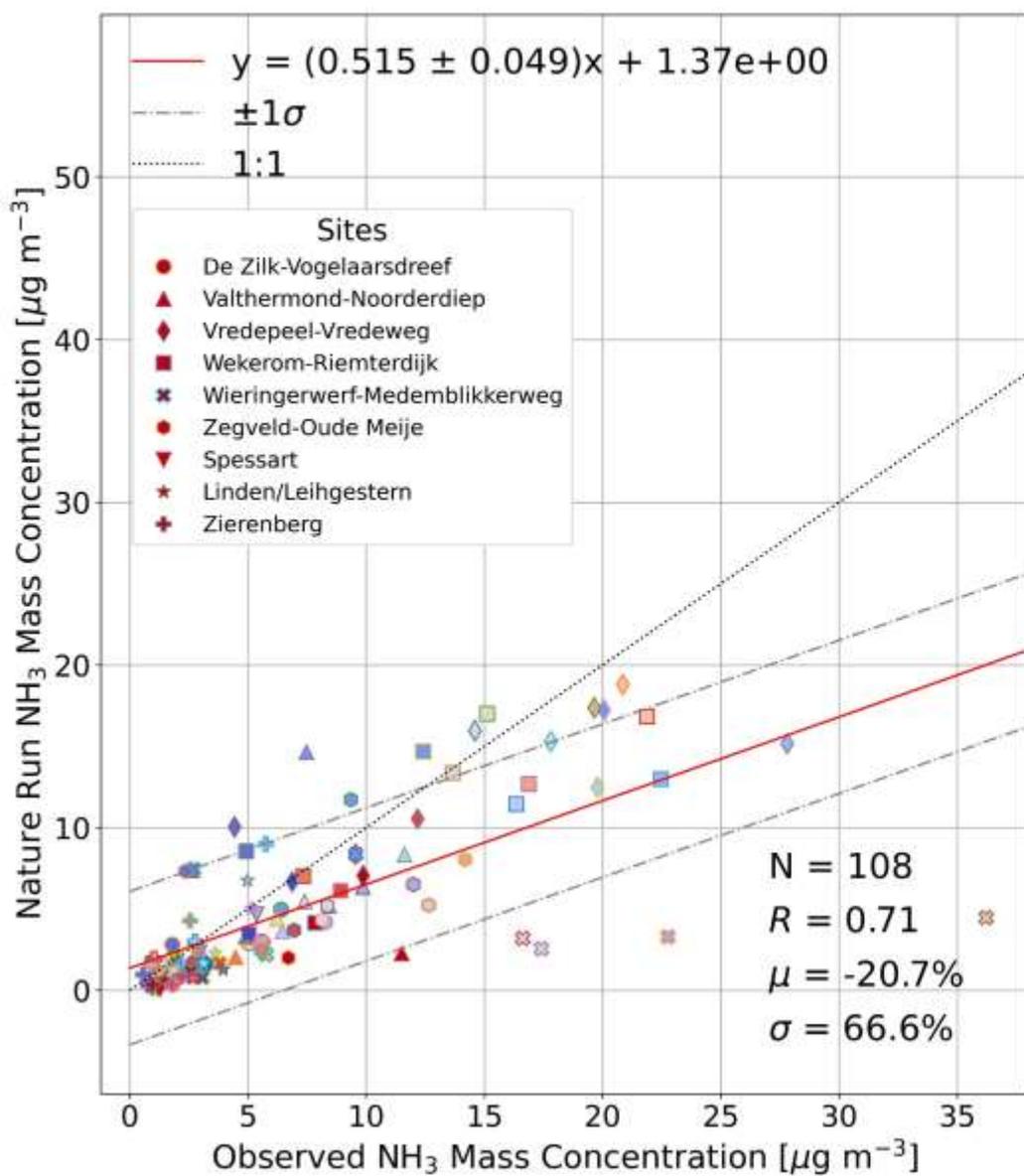
Relative Difference (Opt - Base)/Base



-40 -20 0 20 40
Difference [%]

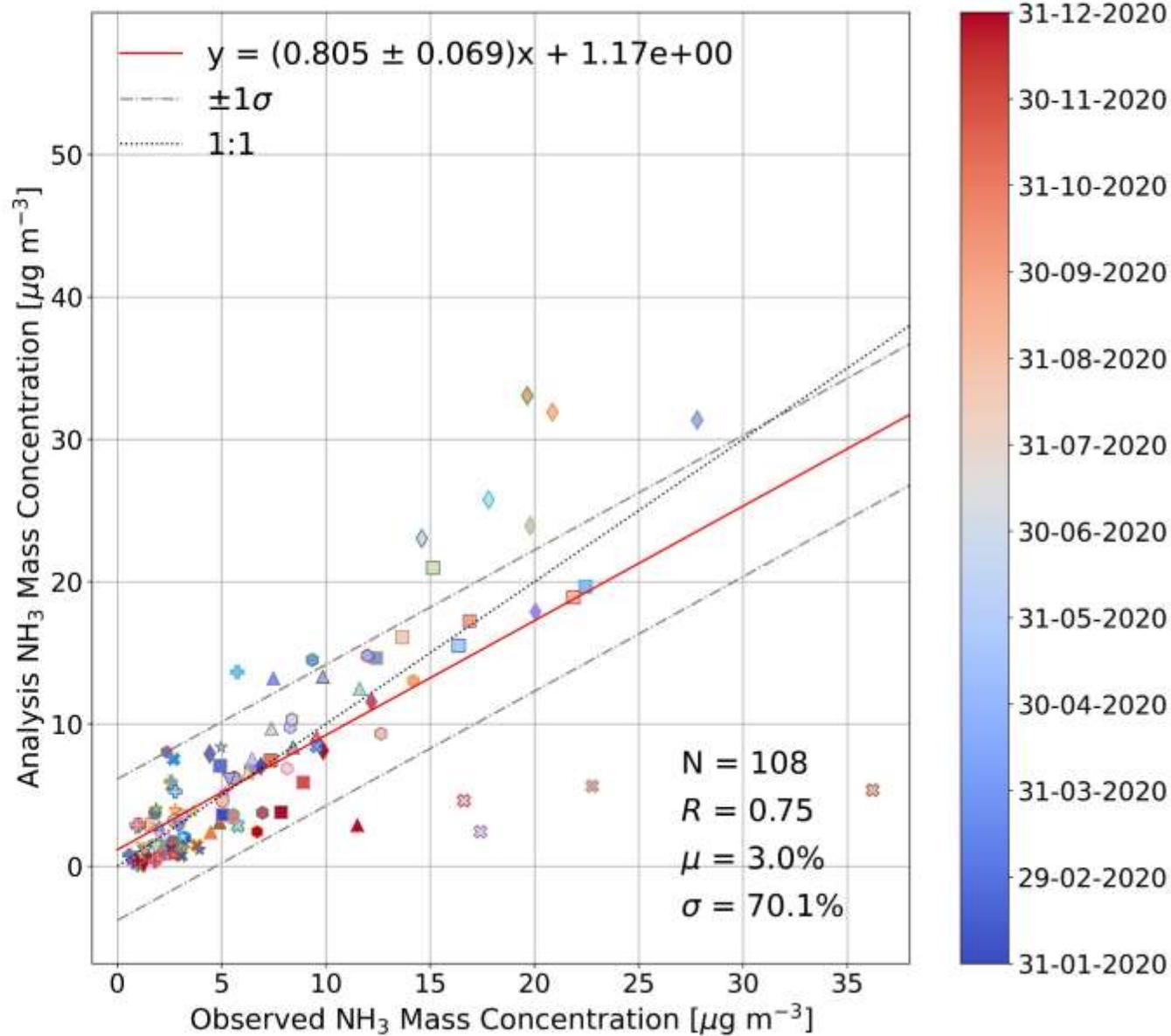
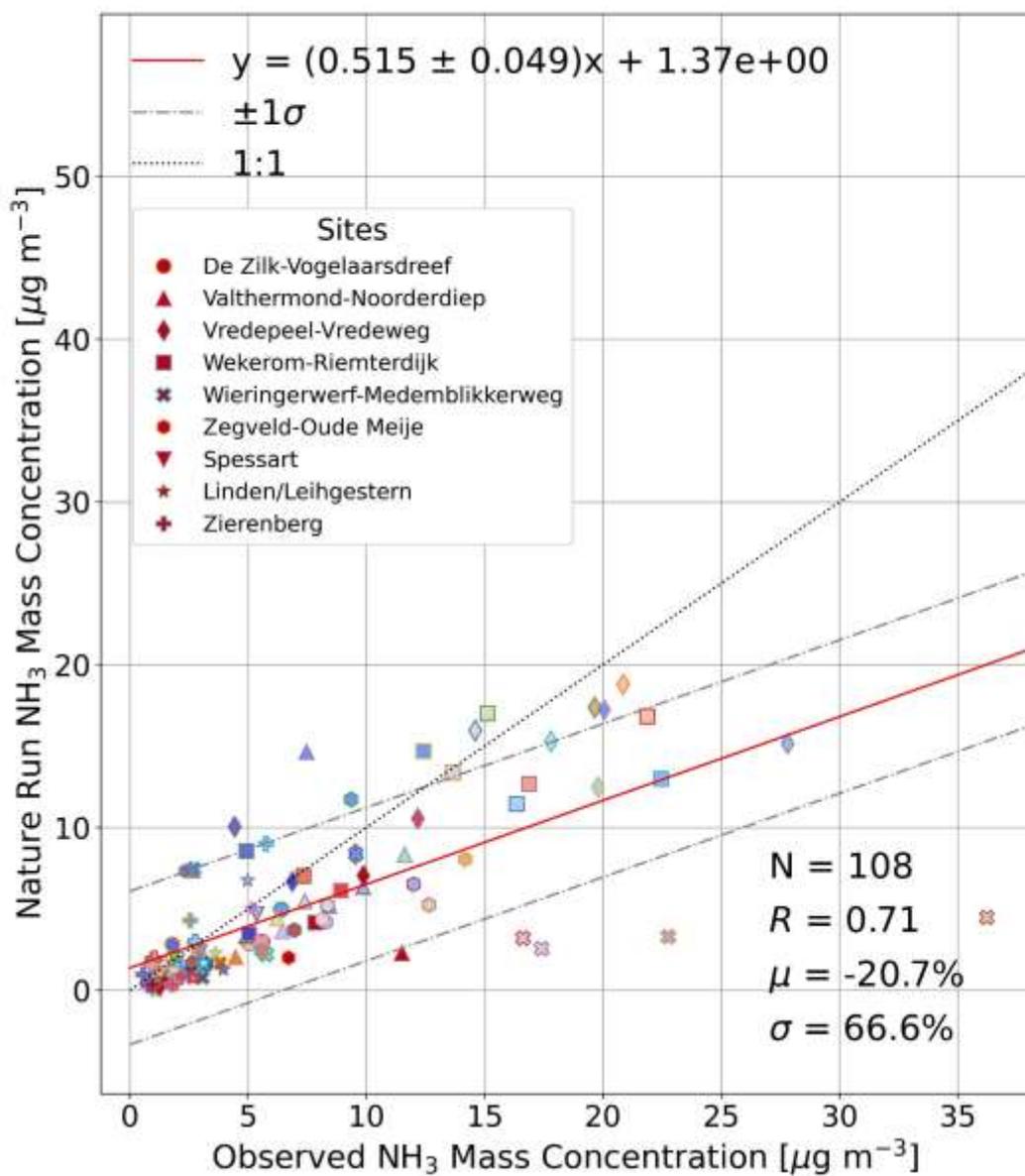
Results – Concentration after co-assimilation

Monthly Temporal Mean Ground-based vs. Modeled
 NH_3 Concentrations ($N_{\text{sites}} = 9$)



Results – Concentration CrIS/IASI only

Monthly Temporal Mean Ground-based vs. Modeled
NH₃ Concentrations (N_{sites} = 9)



Calculation of DOFS for the LETKF

Approach of Chen et al. (2023; <https://doi.org/10.5194/acp-23-5945-2023>) was applied.

The averaging kernel \mathbf{A} that describes the sensitivity of the solution to the true value is given by (Chen et al. 2023):

$$\mathbf{A} = \frac{\partial \hat{\mathbf{x}}'}{\partial \mathbf{x}'} = \mathbf{I}_N - \hat{\mathbf{S}}' \mathbf{S}'_a^{-1},$$

Where I_N is the identity matrix, \hat{S}' is the a posteriori covariance matrix, and S'_a is the a priori covariance matrix.

The trace of \mathbf{A} quantifies the number of independent pieces of information gained from the observations (the DOFS).