

living planet symposium

BONN
23–27 May
2022

New insights on NO_x sources from the divergence of the mean NO_2 flux

Steffen Beirle, Christian Borger, Steffen Dörner, Adrian Jost, Thomas Wagner

living planet symposium

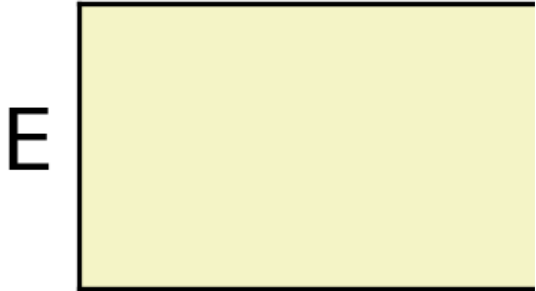
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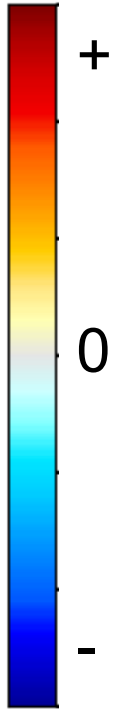
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*Synthetic data
for illustration:*

E: Emissions



Created by Symbolon
from Noun Project



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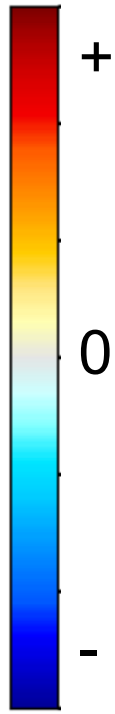
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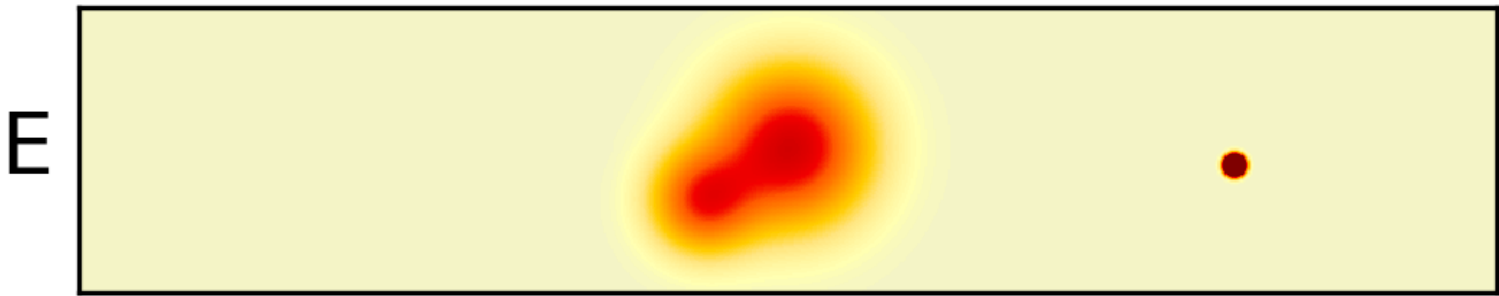


Created by Berce Bezerezy
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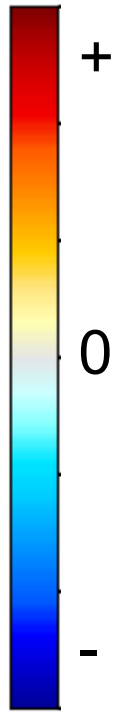
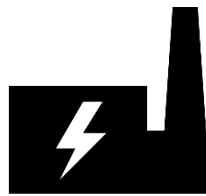
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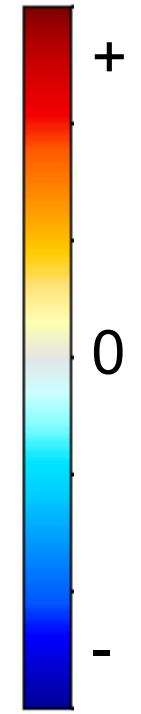
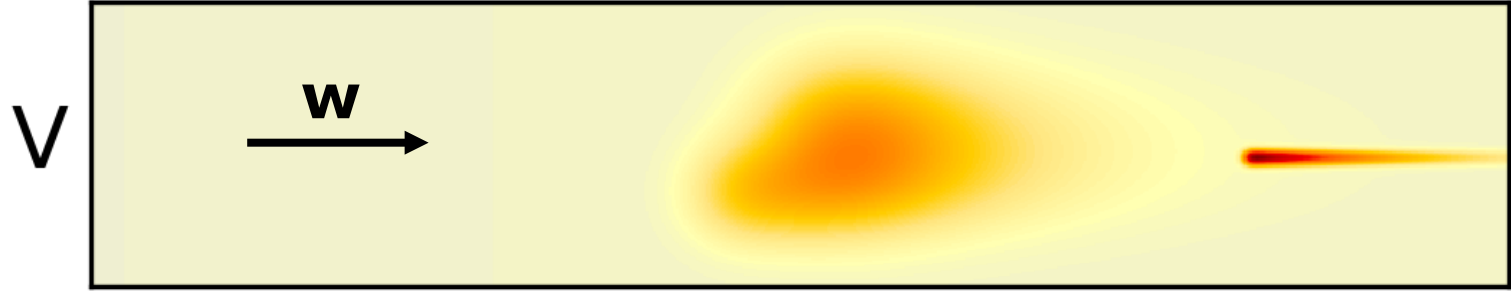
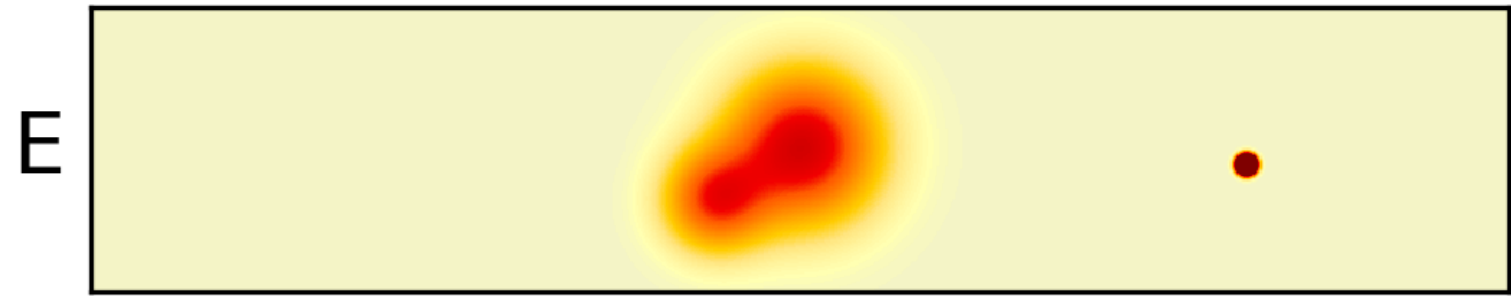
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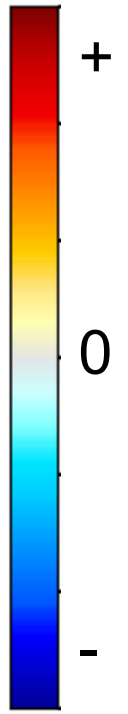
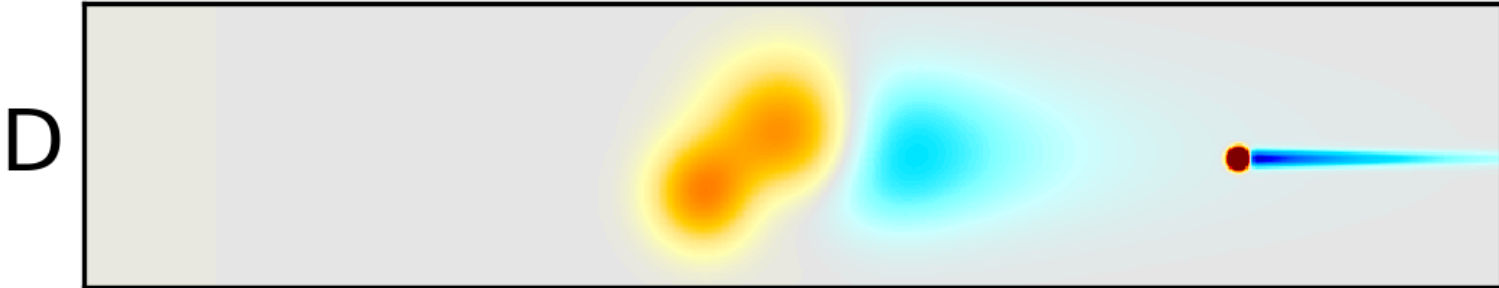
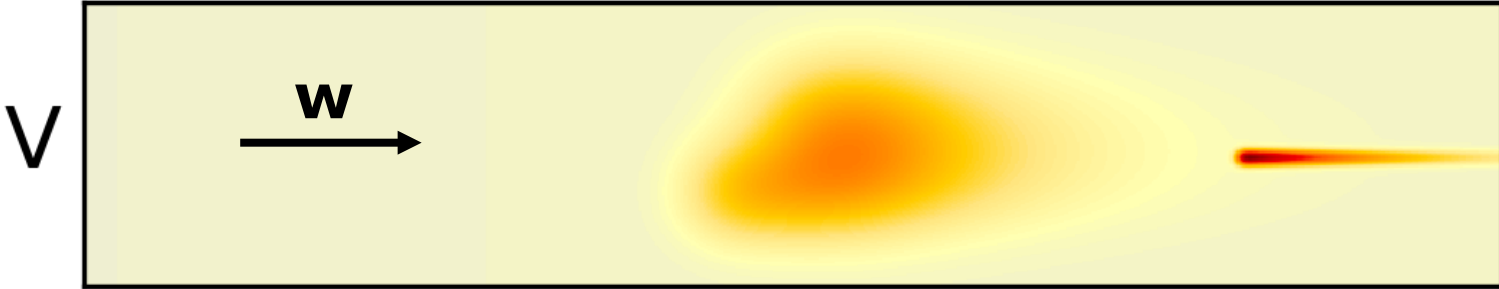
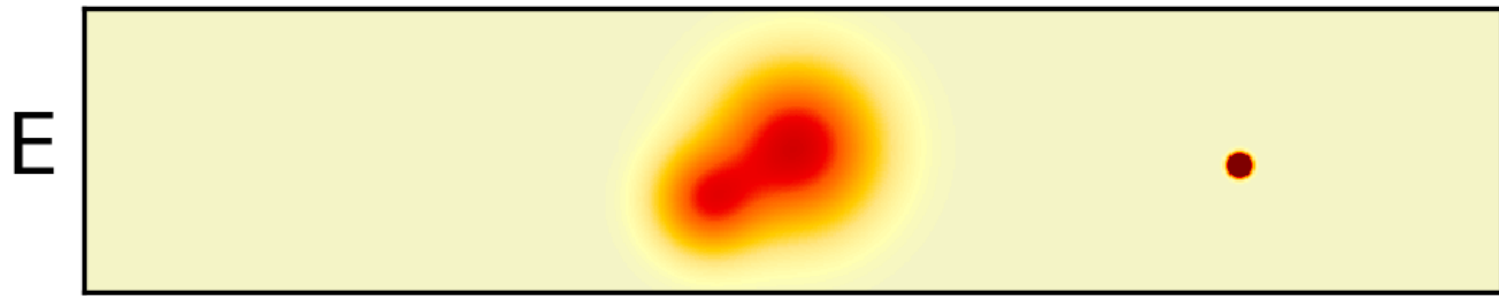
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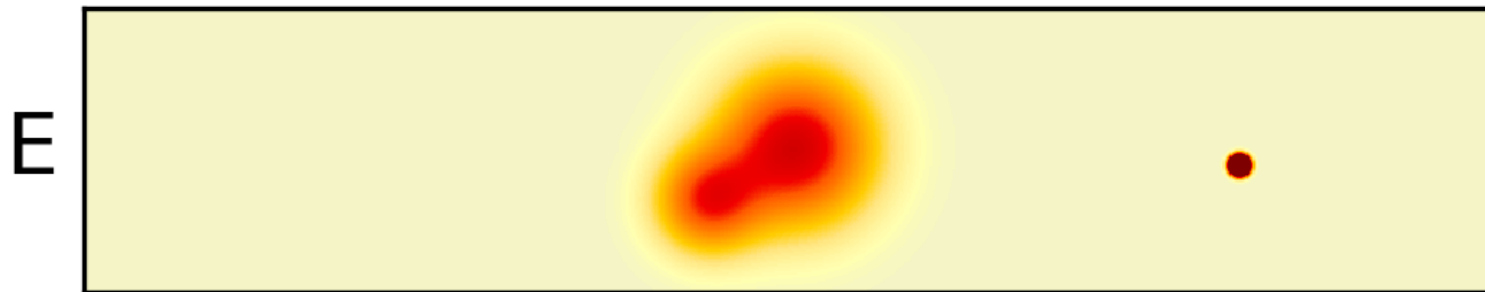
$D = \nabla \cdot \mathbf{F}$:
Divergence





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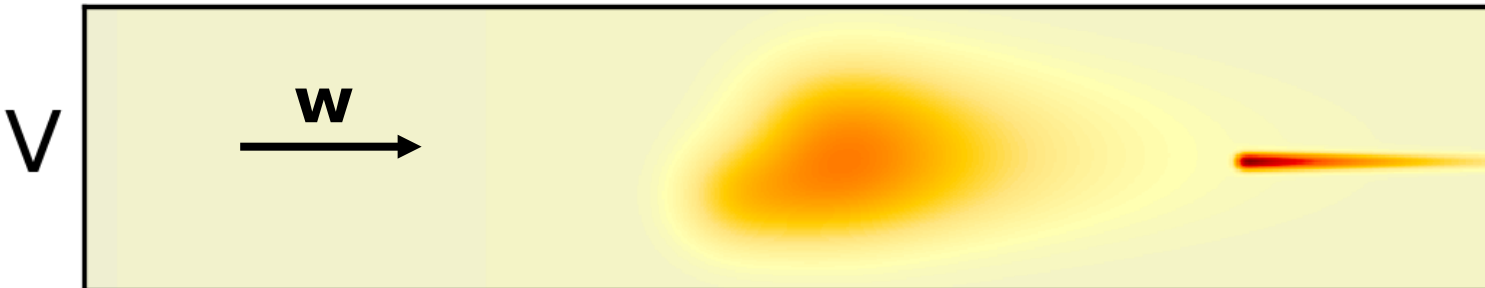
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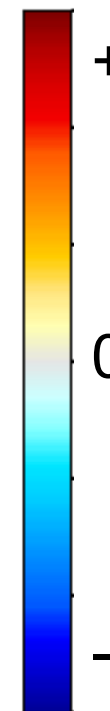
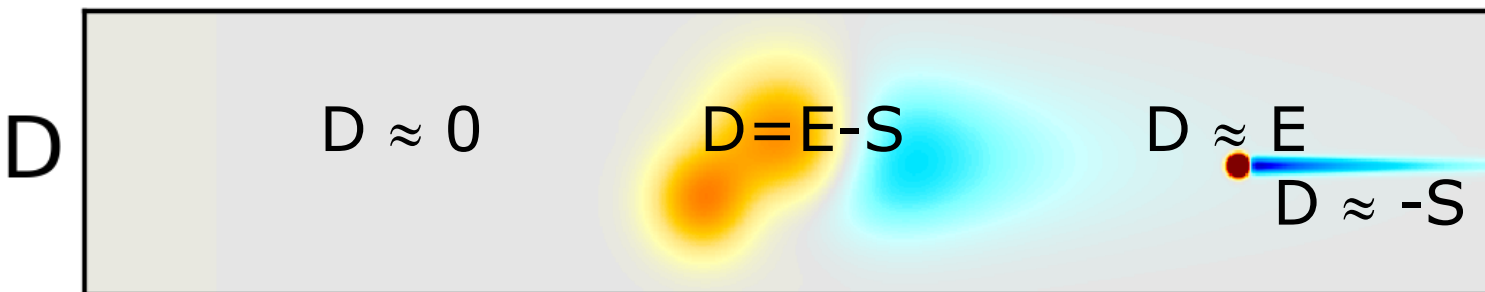
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Steady state:

$$D = E - S$$

S: Sinks

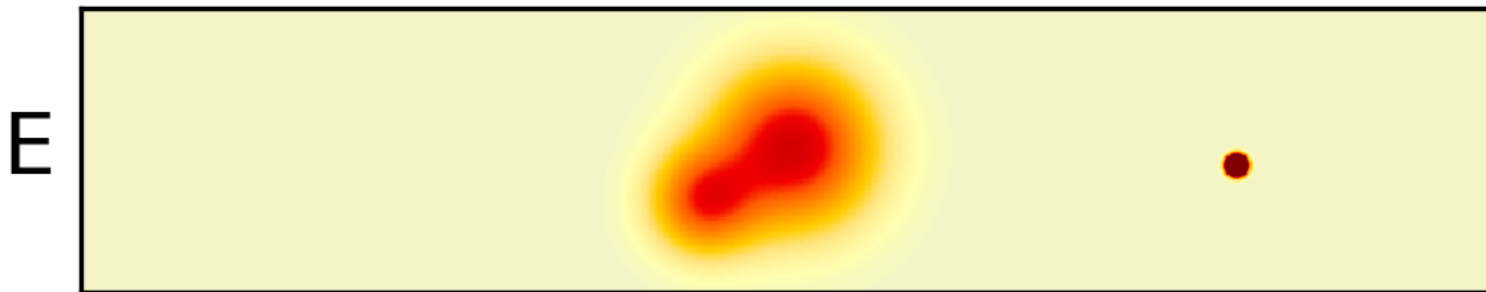
$$S = V/\tau$$

$$E = D + S$$



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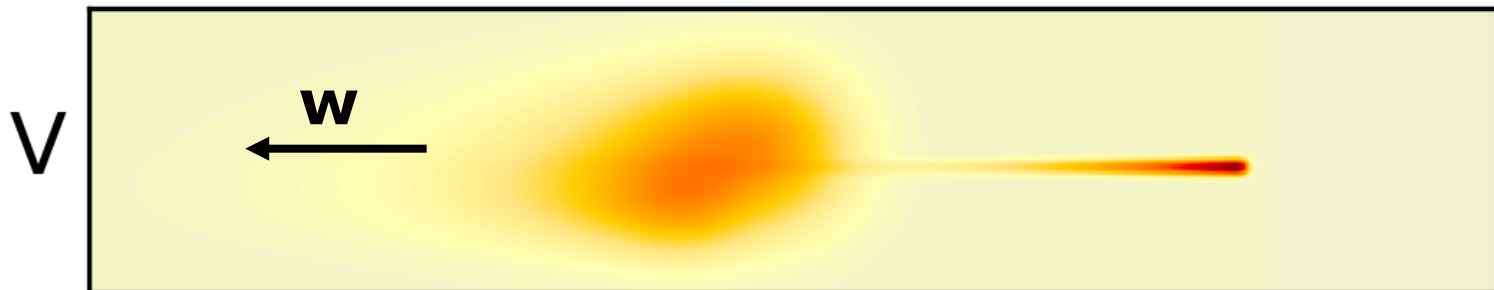
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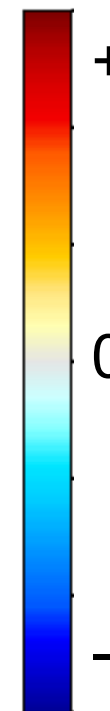
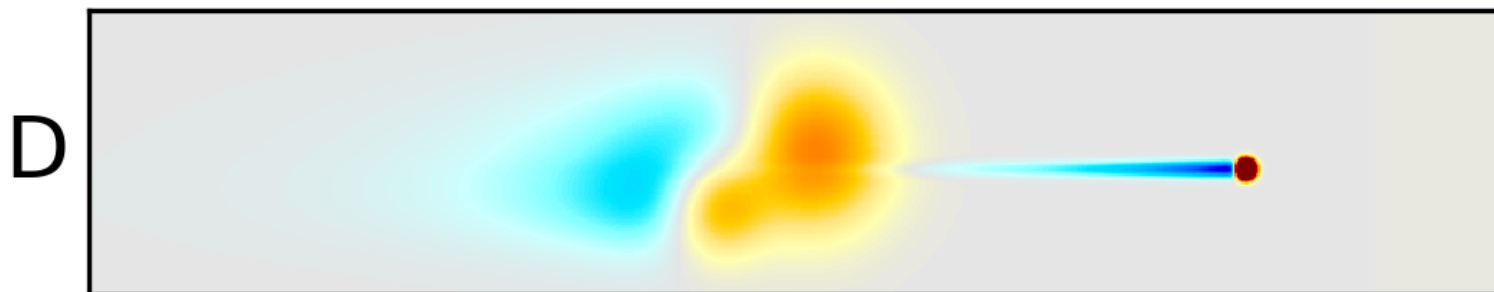
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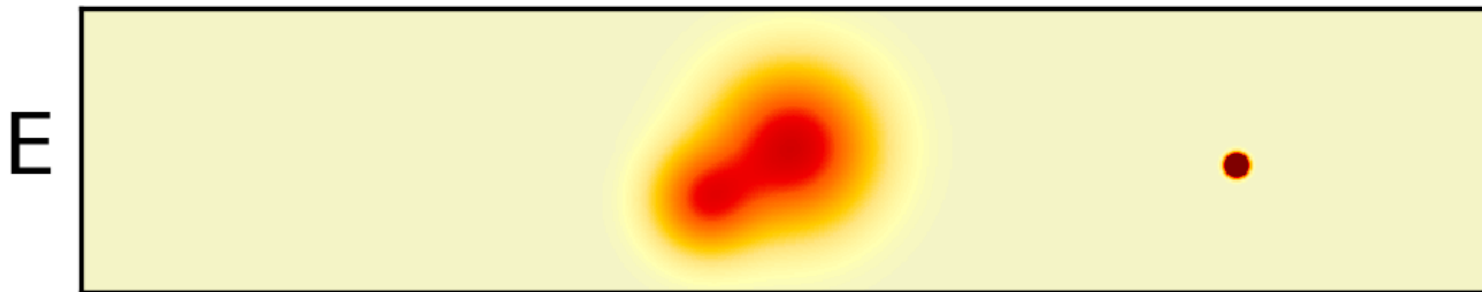
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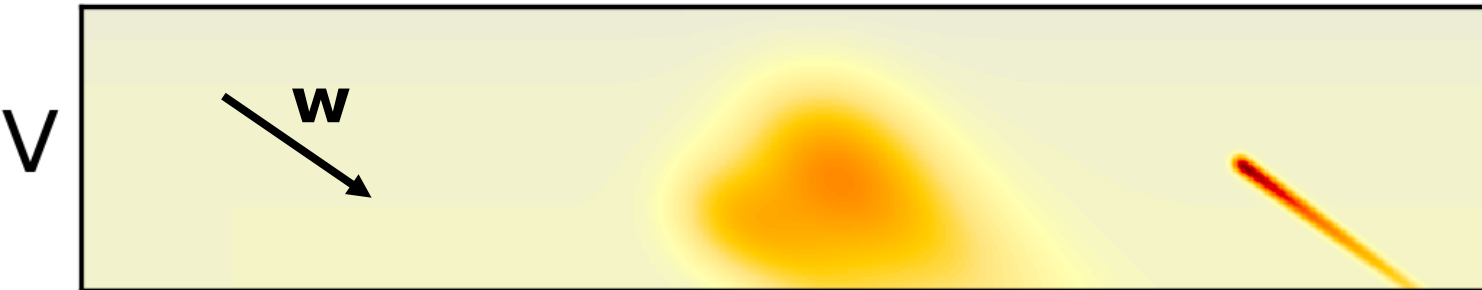
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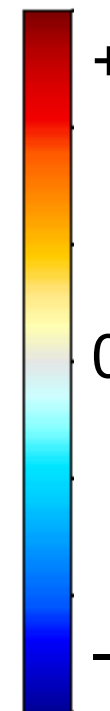
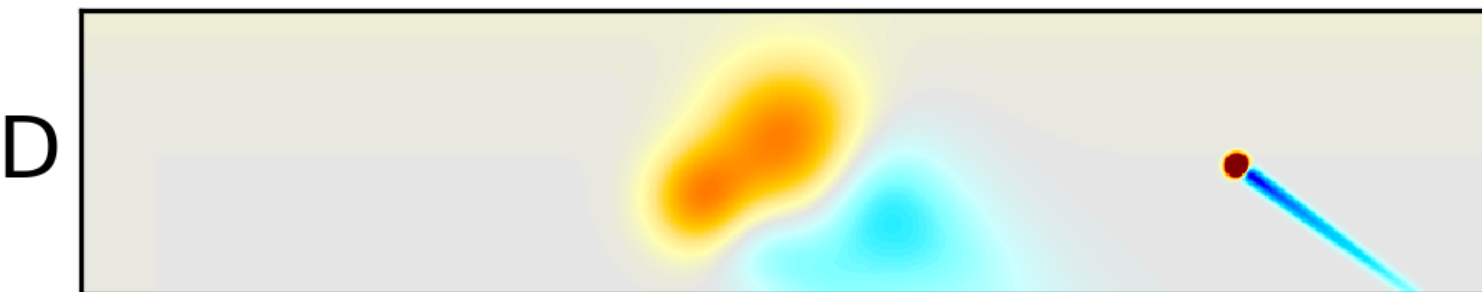
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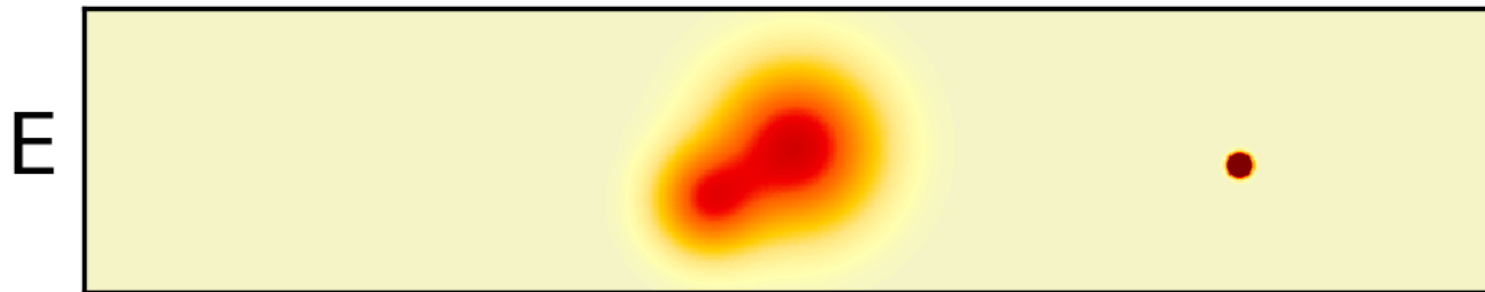
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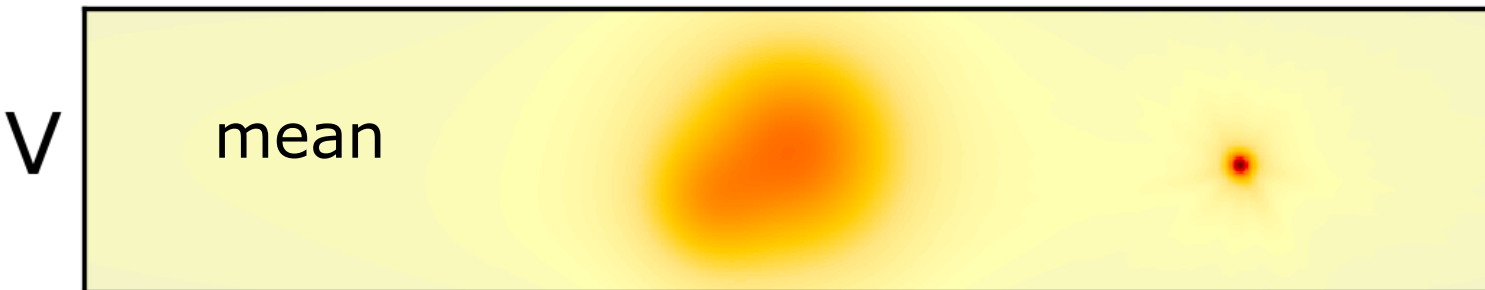
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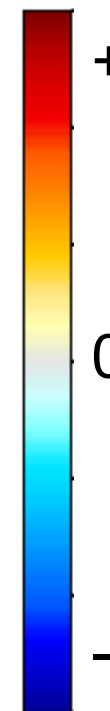
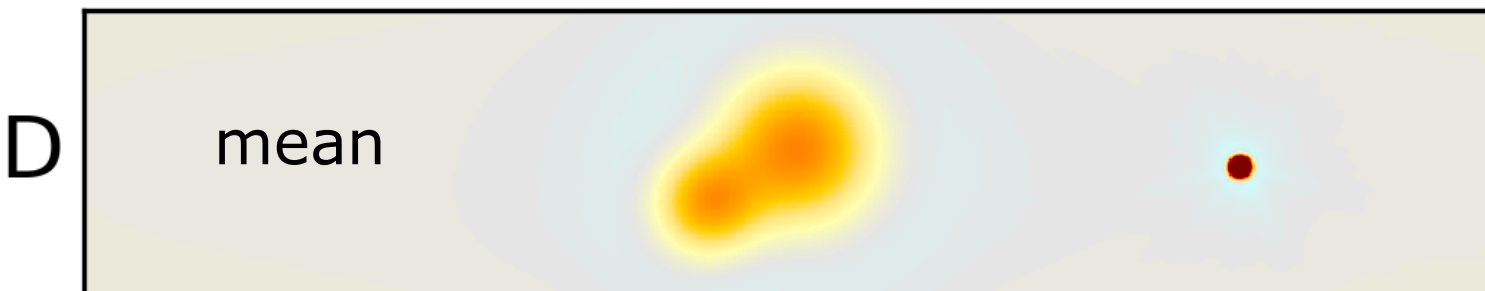
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Steady state:

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S: Sinks

$$S = V/\tau$$

$$E = D + S$$

Reality is more complex:

- Turbulence & diffusion
- τ might change with downwind distance
- 3rd dimension: \mathbf{w} and τ change with altitude
- No steady state: \mathbf{w} , E, τ ... change with time

Not critical for point sources!



ATMOSPHERIC SCIENCE

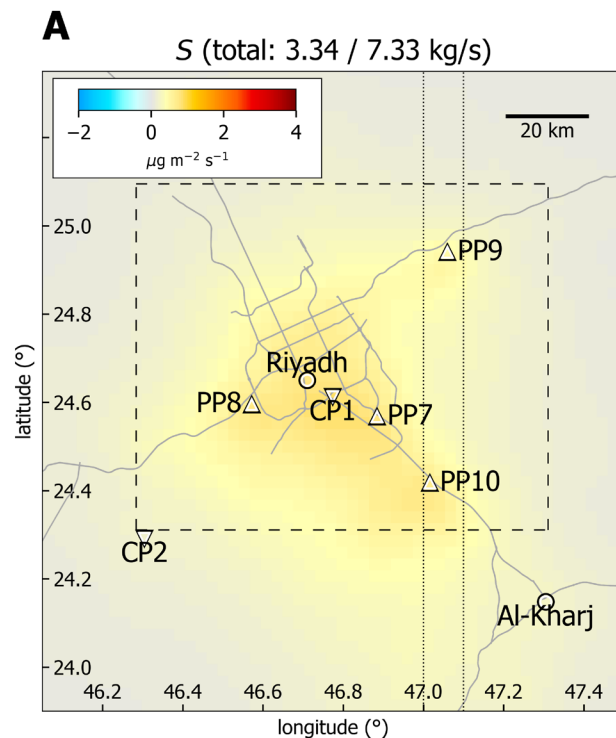
Pinpointing nitrogen oxide emissions from space

Steffen Beirle^{1*}, Christian Borger¹, Steffen Dörner¹, Ang Li², Zhaokun Hu², Fei Liu^{3,4},
Yang Wang¹, Thomas Wagner^{1,5}

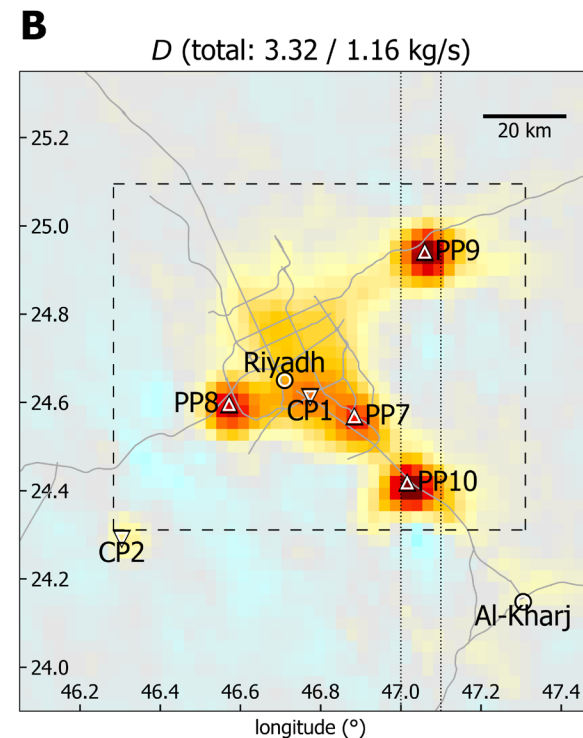
Beirle *et al.*, *Sci. Adv.* 2019; **5**:eaax9800 13 November 2019

Riyadh

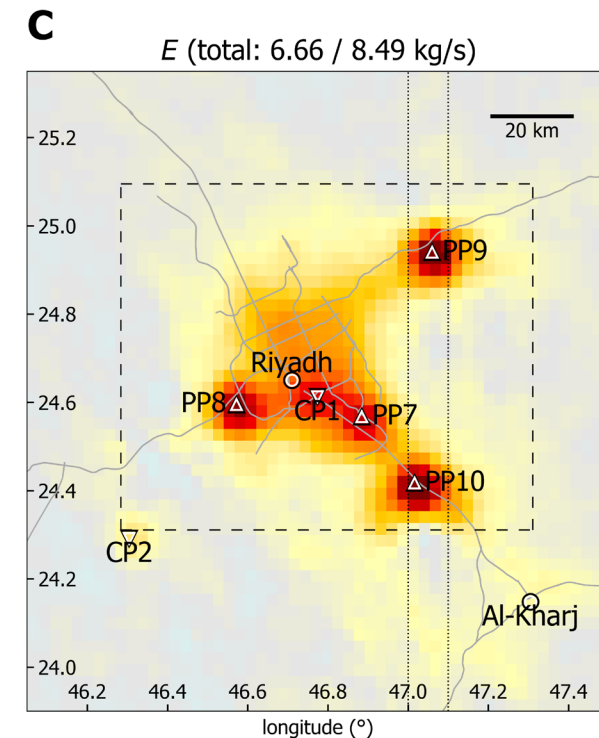
$$S = V/\tau$$



$$D = \nabla (Vw)$$



$$E = S + D$$



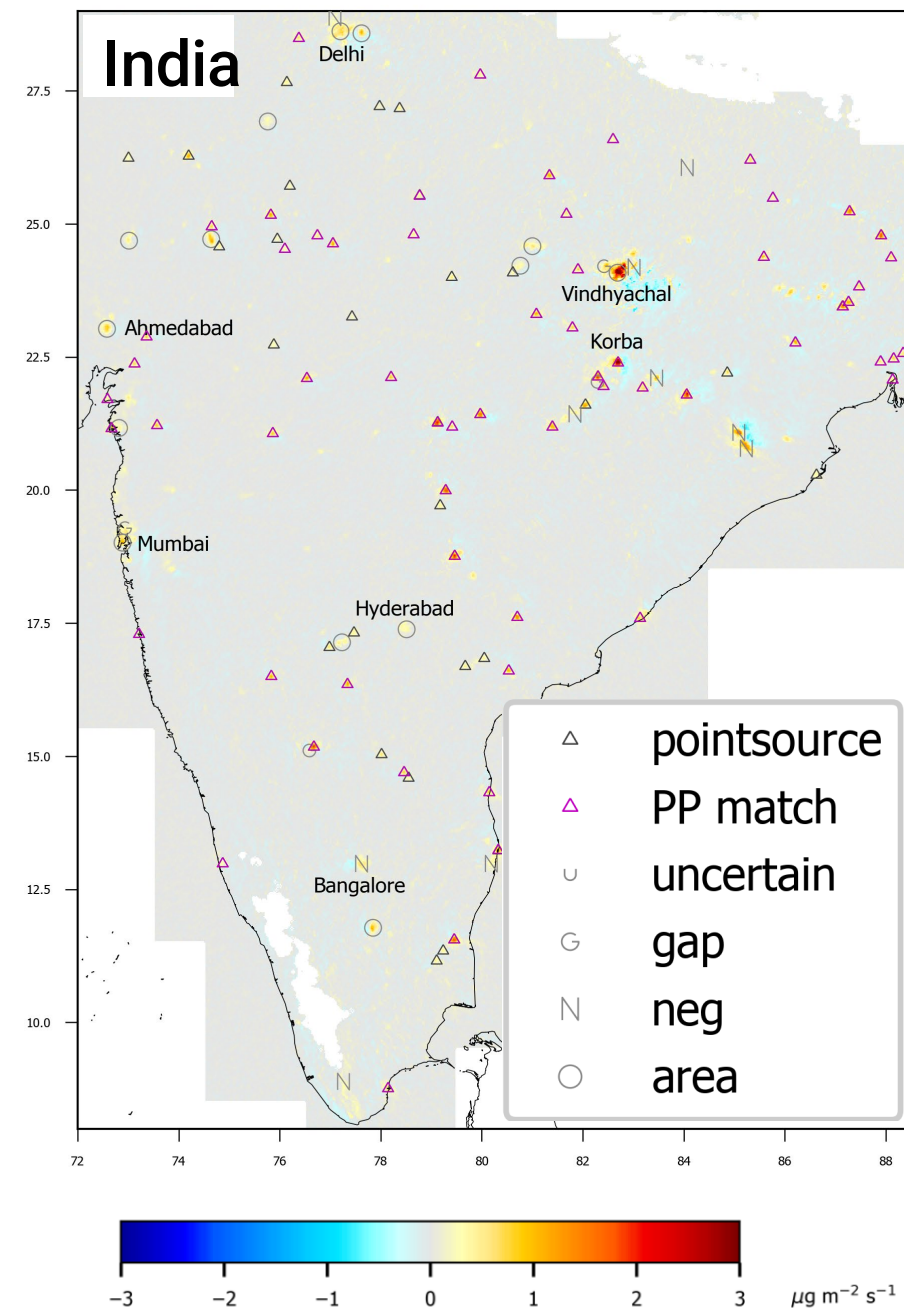
Catalog of NO_x emissions from point sources as derived from the divergence of the NO_2 flux for TROPOMI

Open Access Earth System Science Data

Steffen Beirle¹, Christian Borger¹, Steffen Dörner¹, Henk Eskes², Vinod Kumar¹, Adrianus de Laat², and Thomas Wagner¹

<https://doi.org/10.5194/essd-13-2995-2021>

- 451 point sources detected by fully automated algorithm (power plants, cement plants, metal smelters, industrial areas, small cities)
- For 242 point sources: match in Global Power Plant Database within 5 km



Catalog of NO_x emissions from point sources as derived from the divergence of the NO₂ flux for TROPOMI

Open Access Earth System
Science
Data

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Steffen Beirle¹, Christian Borger¹, Steffen Dörner¹, Henk Eskes², Vinod Kumar¹, Adrianus de Laat²,
and Thomas Wagner¹

<https://doi.org/10.5194/essd-13-2995-2021>

- Catalog lists NO_x point sources worldwide
- High accuracy of **point source location**

Remaining issues:

1. Catalog is **incomplete**:

- Persistent gaps in **input data**
- **Noise in divergence / sampling issues**, particularly for regions with frequent cloud cover
- Systematic artefacts (input wind fields / **mountains**)

2. Emissions are **biased low**:

- Missing **lifetime correction**
- Wrong **a-priori profile**

A lot to be improved...

Towards v2 of the NO_x catalog: Applied and planned improvements (wip)



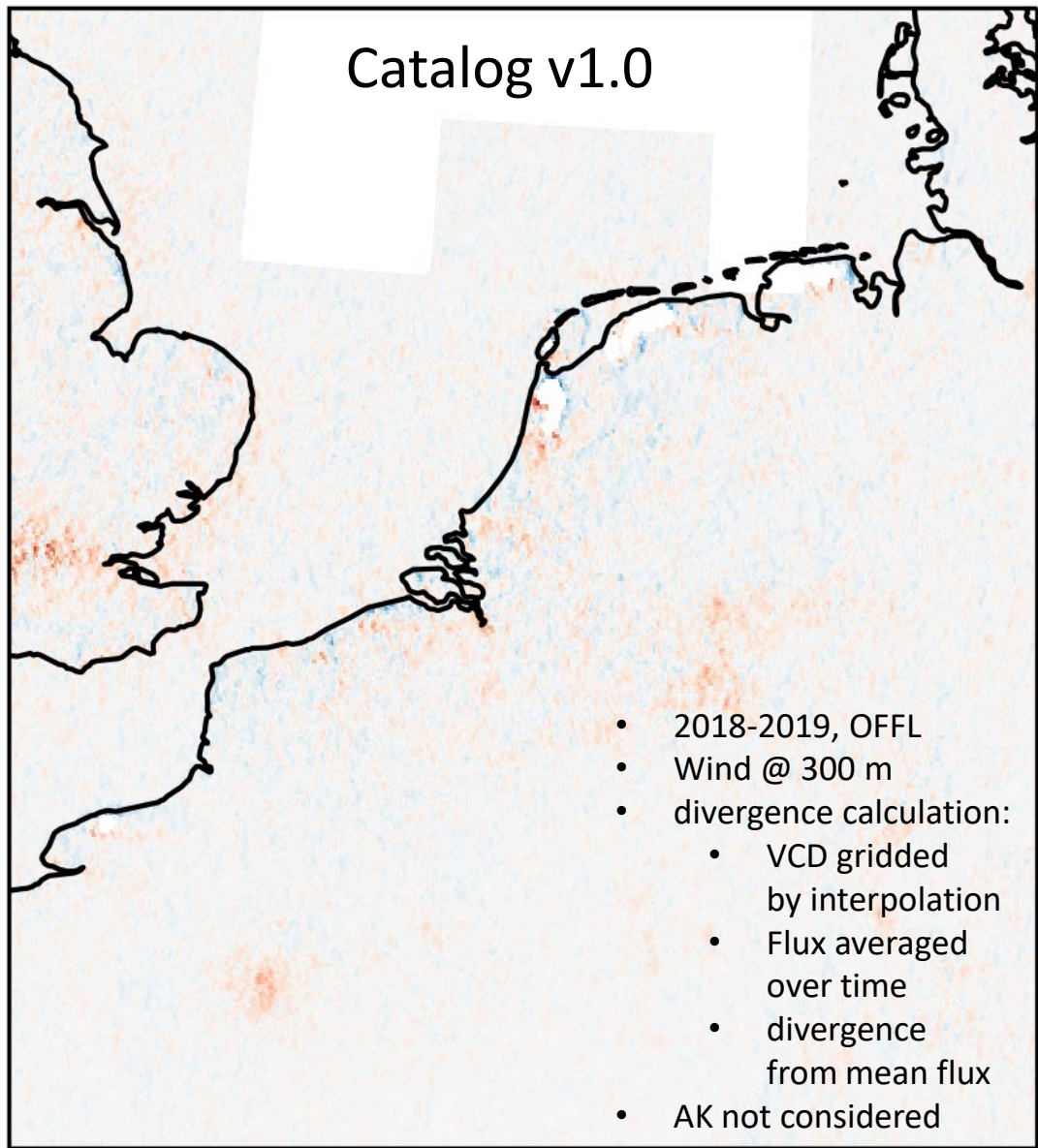
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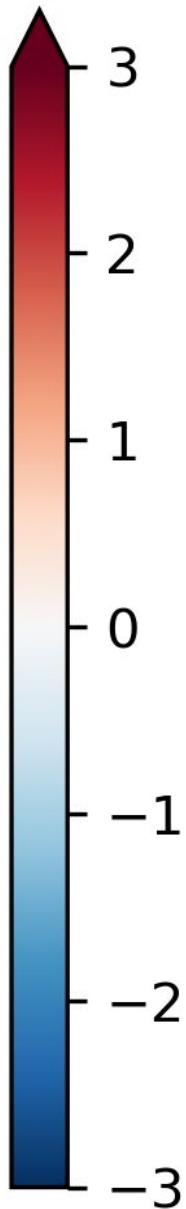
Update (wip):

- Use **reprocessed data (PAL)**
- Calculate divergence on **TROPOMI grid** (de Foy et al., 2022)
- Use **high-res wind fields** (not yet done – straightforward, but expensive)

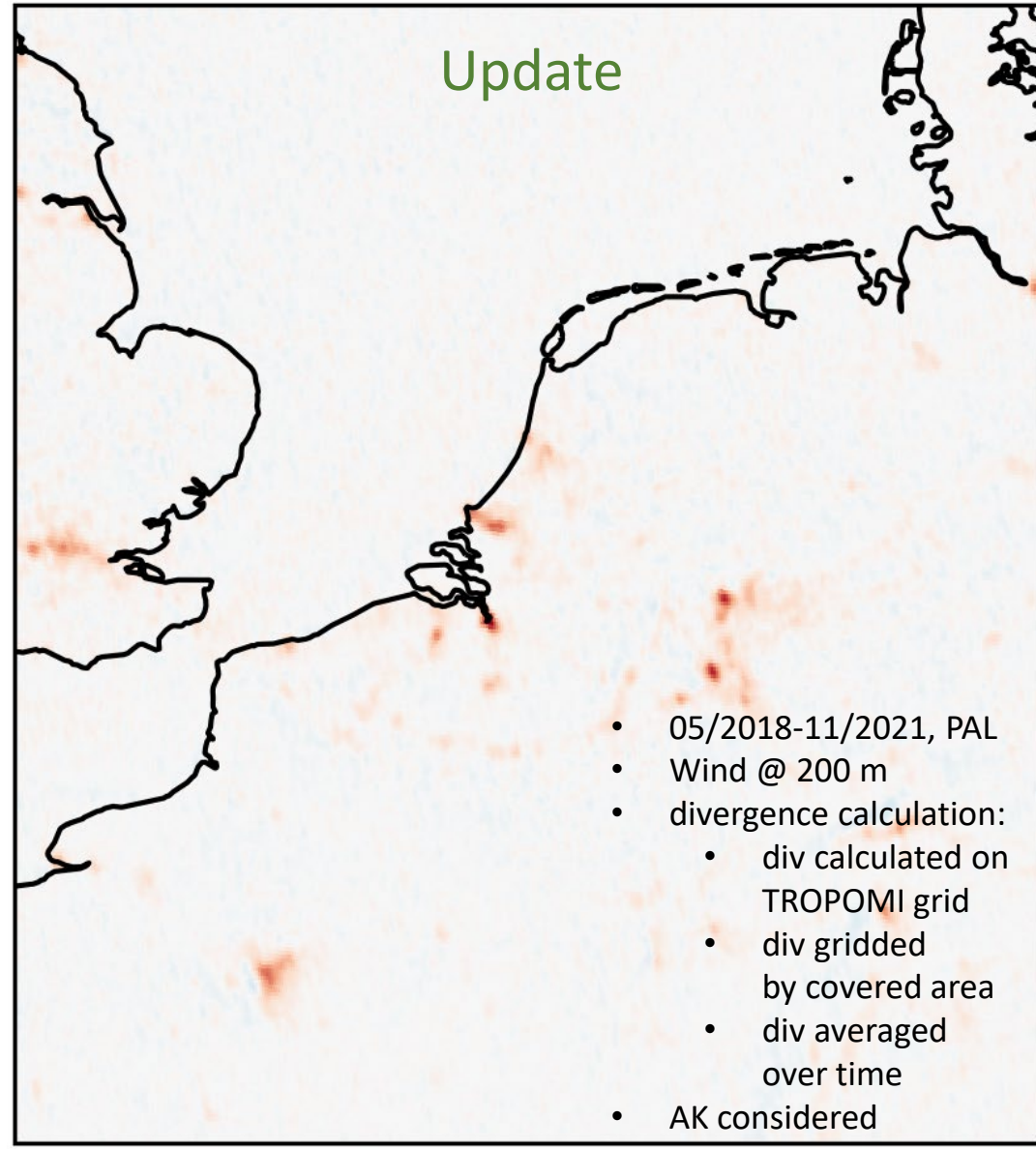
Catalog v1.0



Divergence [$\mu\text{g m}^{-2} \text{s}^{-1}$]

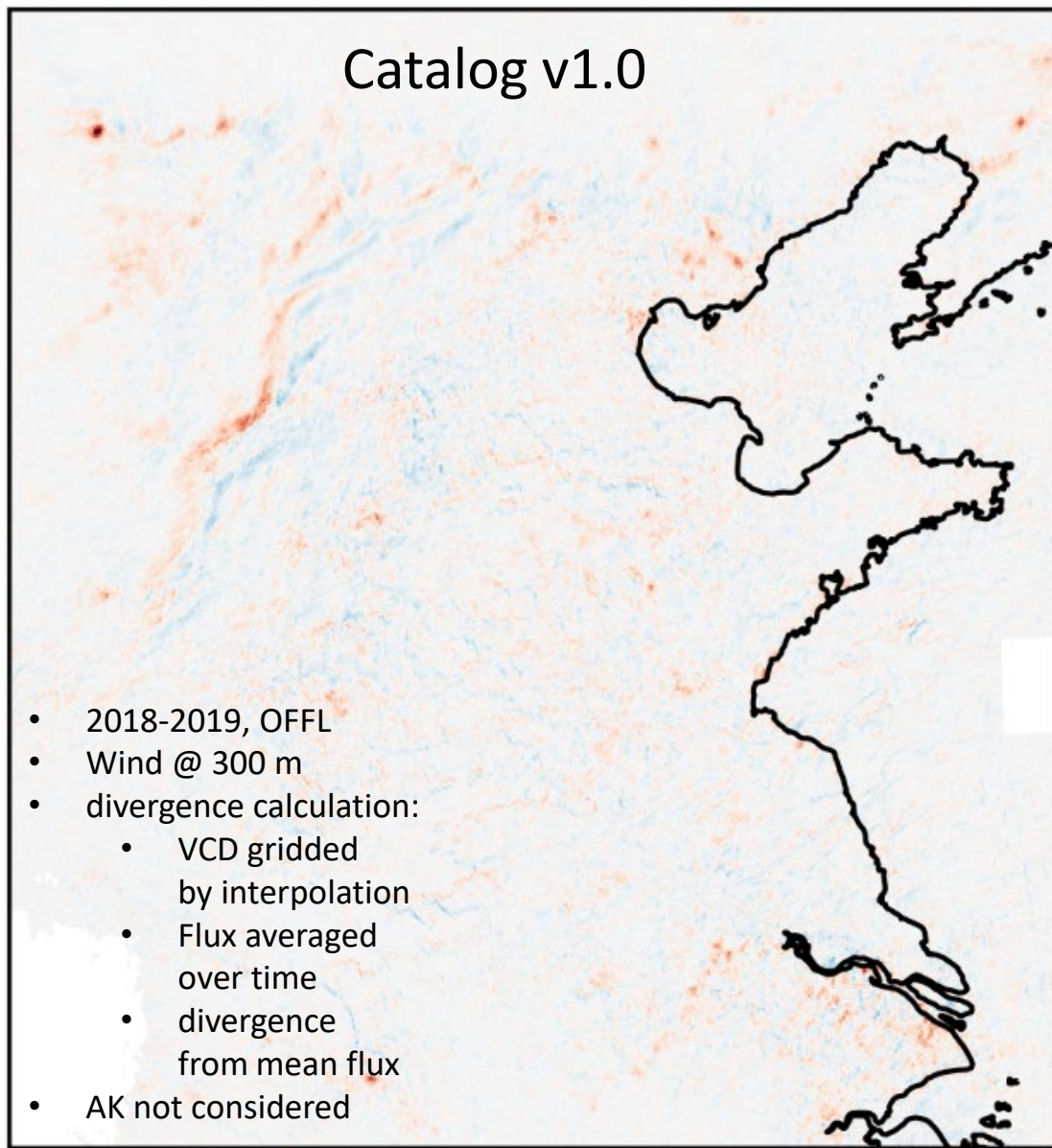


Update

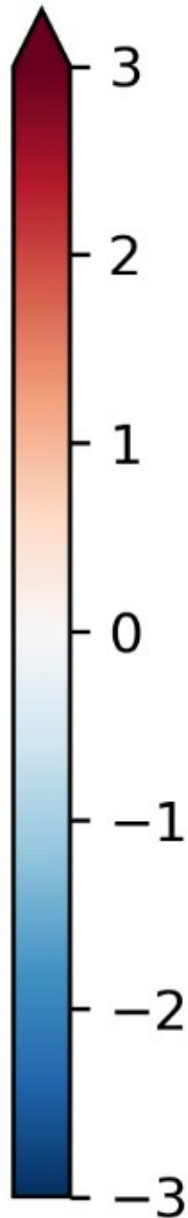


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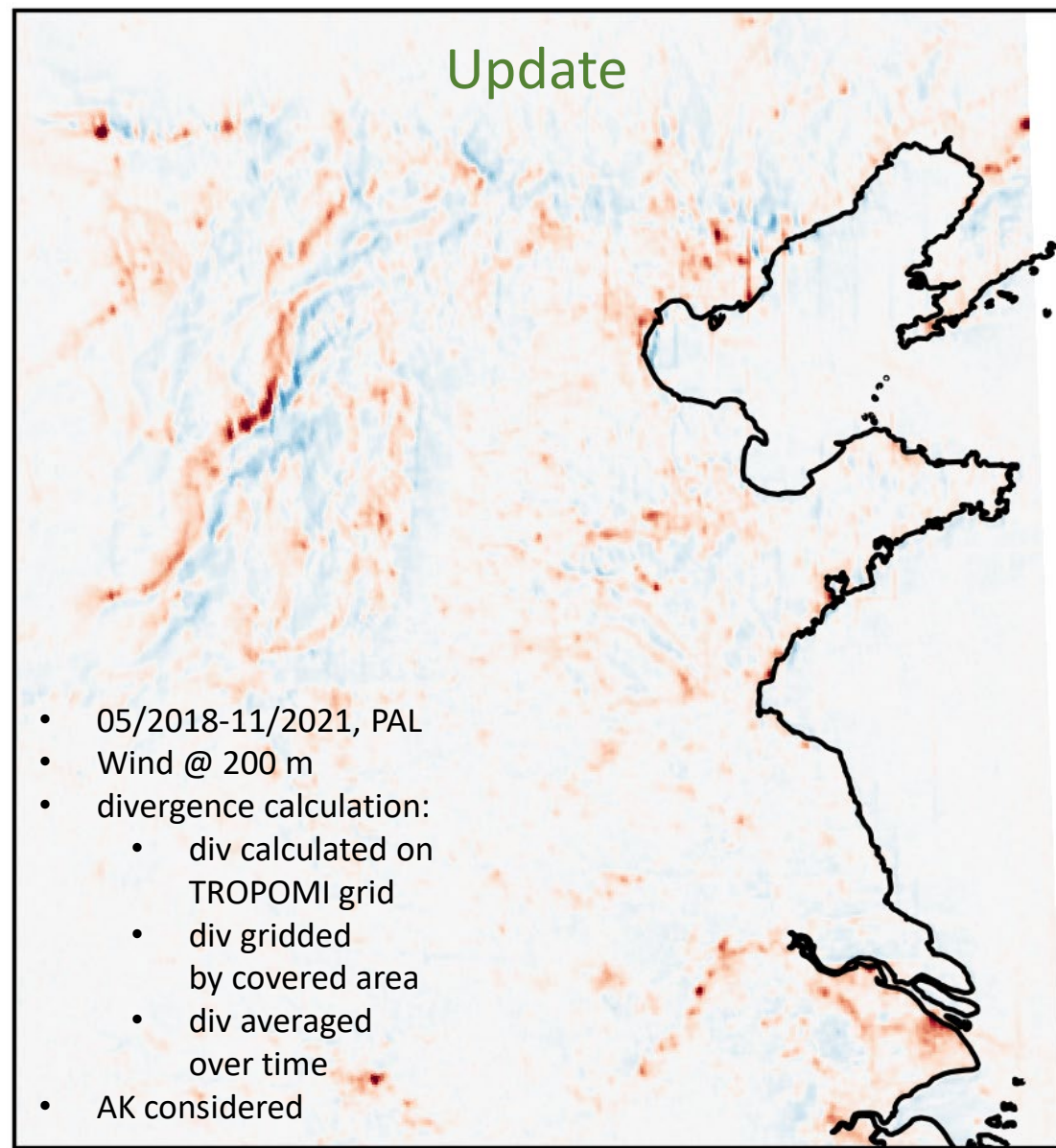
Catalog v1.0



Divergence [$\mu\text{g m}^{-2} \text{s}^{-1}$]



Update



Divergence [$\mu\text{g m}^{-2} \text{s}^{-1}$]

Towards v2 of the NO_x catalog: Applied and planned improvements (wip)

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2. Emissions are **biased low**:
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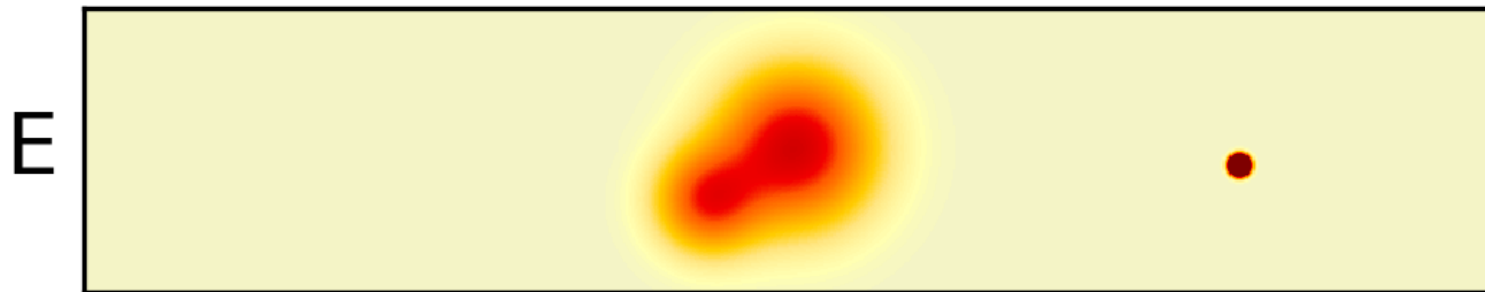
A-priori vertical profile

- Needed for the calculation of air-mass factors
- Generally:
 - Complex
 - Not represented appropriately by global model on relatively coarse spatial resolution
- VCD can be corrected for actual profile via provided averaging kernels (AKs)



*Synthetic data
for illustration:*

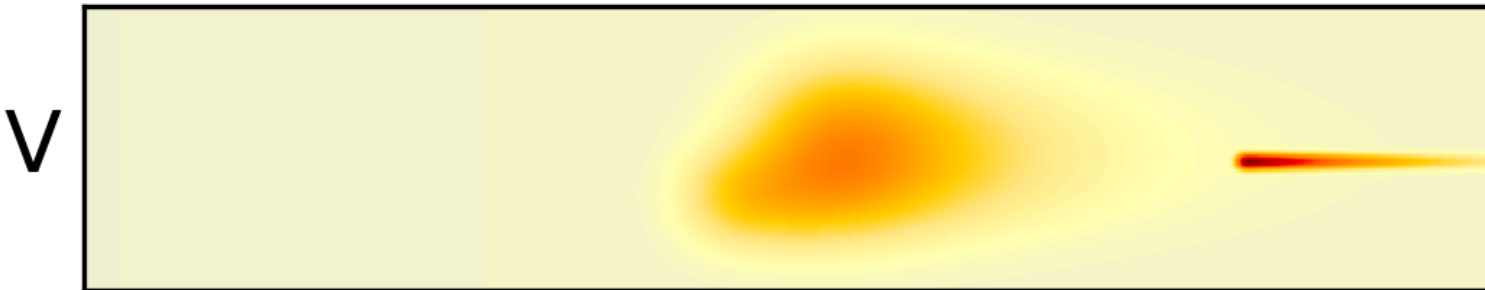
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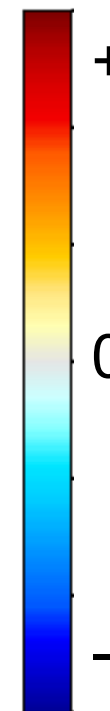
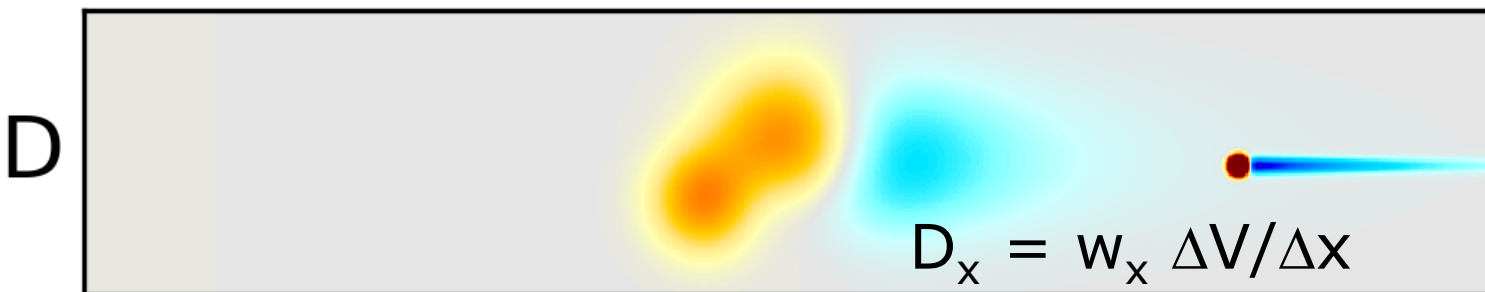
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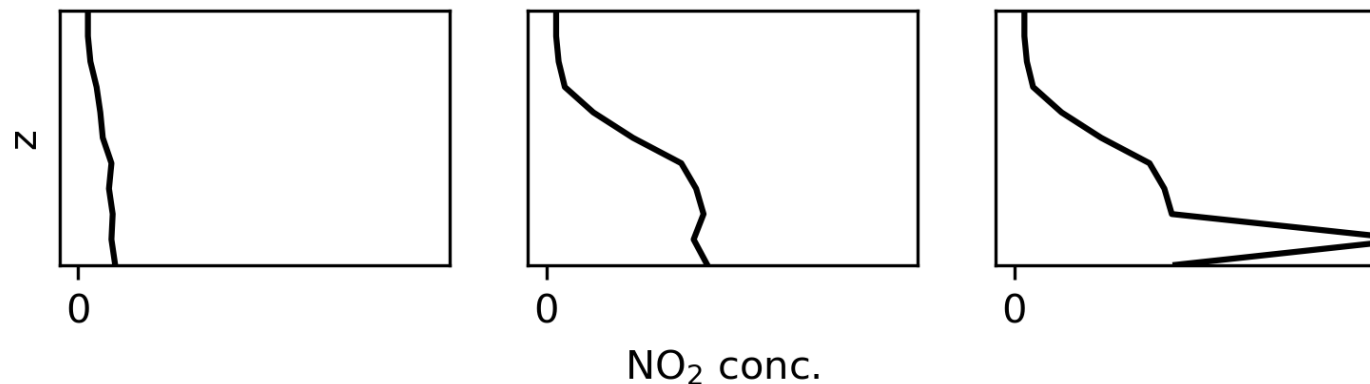
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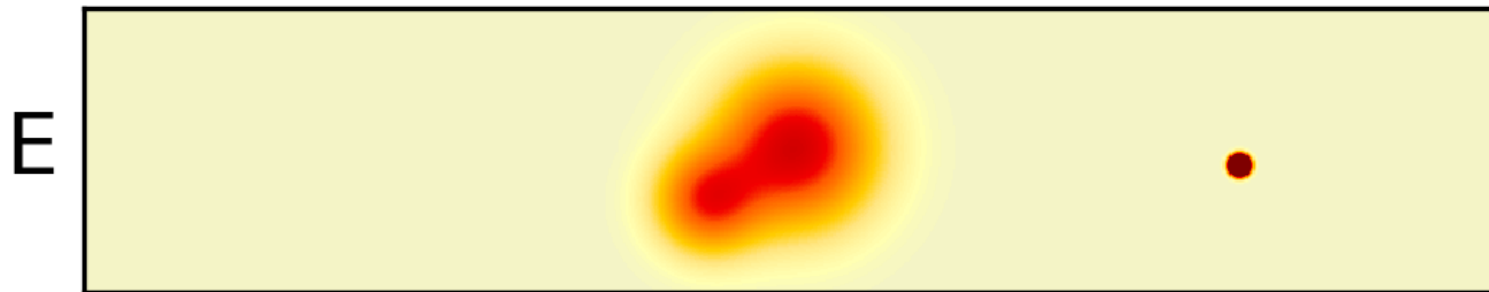
For correct V:
NO₂ profile required
(complex!)





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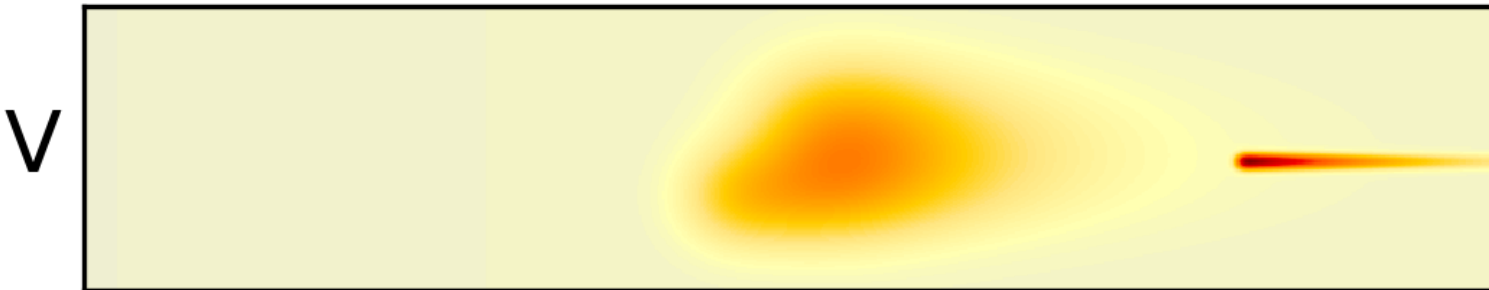
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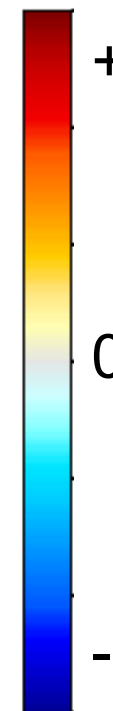
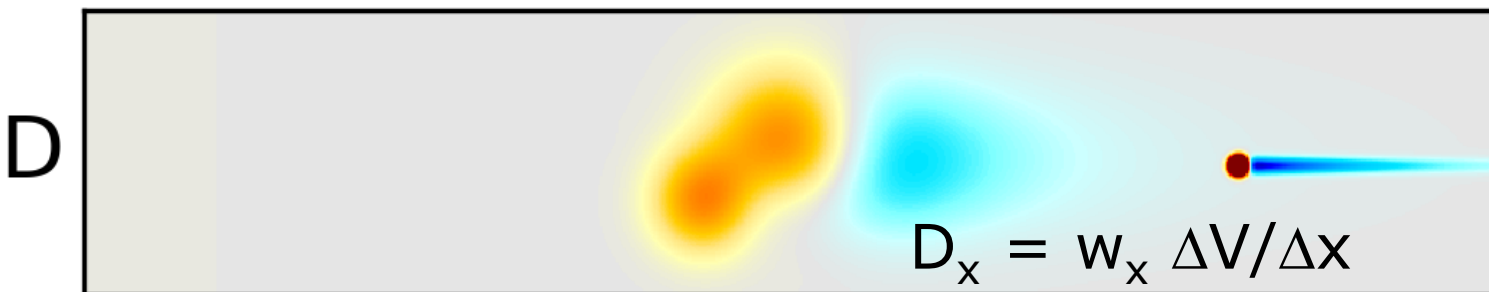
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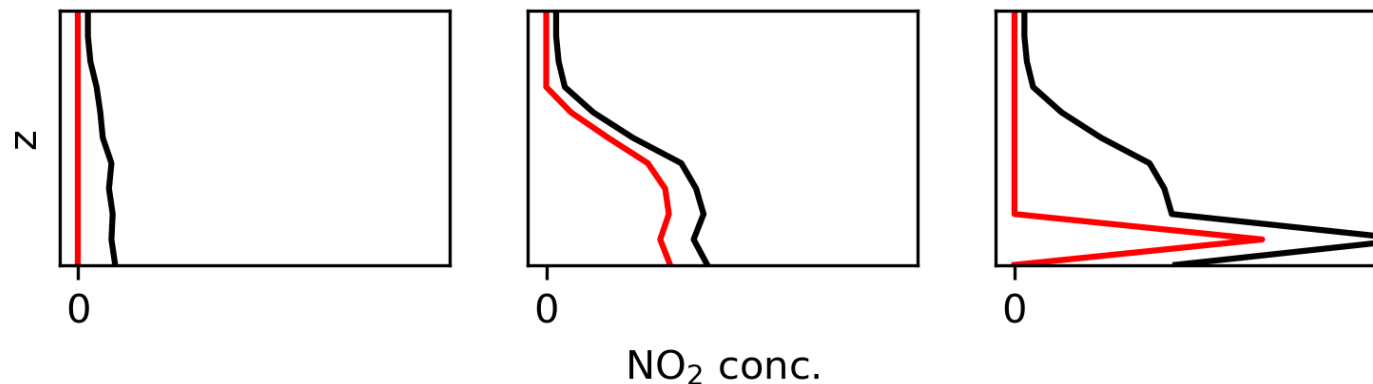
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For correct V:
NO₂ profile required
(complex!)



For correct D:
NO₂ excess
profile required
(simple!)

Towards v2 of the NO_x catalog: Applied and planned improvements (wip)

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2. Emissions are **biased low**:

- Missing **lifetime correction**
- Wrong **a-priori profile**

Update (wip):

- Apply **lifetime correction**
- Apply **AK correction**

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Emissions in kg/s	Power plant	EPA (2019)	Catalog v1 (2018-2019)
	New Madrid	0.446	0.074
	Colstrip	0.432	0.079
	Miami Fort	0.360	0.053
	Navajo	0.351	0.115
	Hunter	0.333	0.040
	Scherer	0.319	-
	Martin Lake	0.301	-
	Fort Martin	0.298	-
	Intermountain	0.287	0.054
	Thomas Hill	0.285	0.037

Towards v2 of the NO_x catalog: Applied and planned improvements (wip)



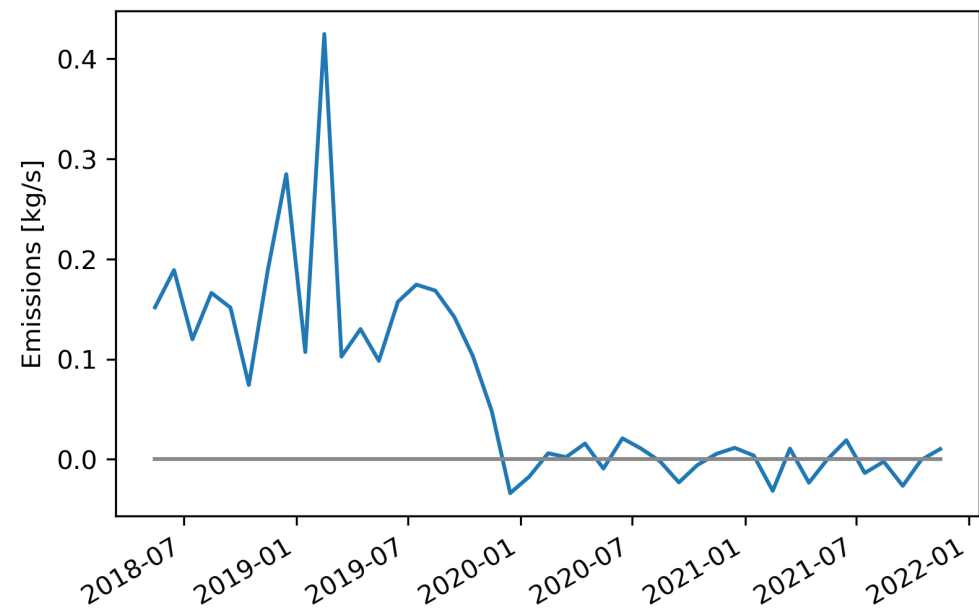
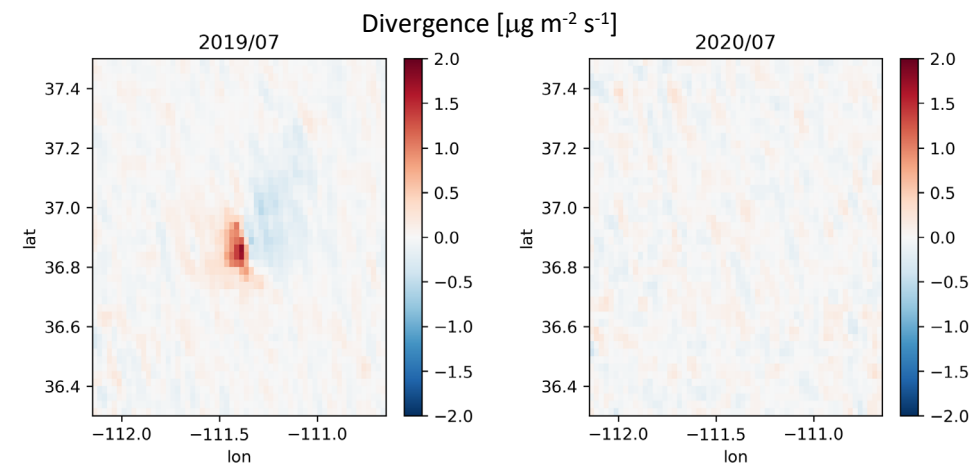
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<https://apnews.com/article/19487208f317460e9643f845e1440f65>

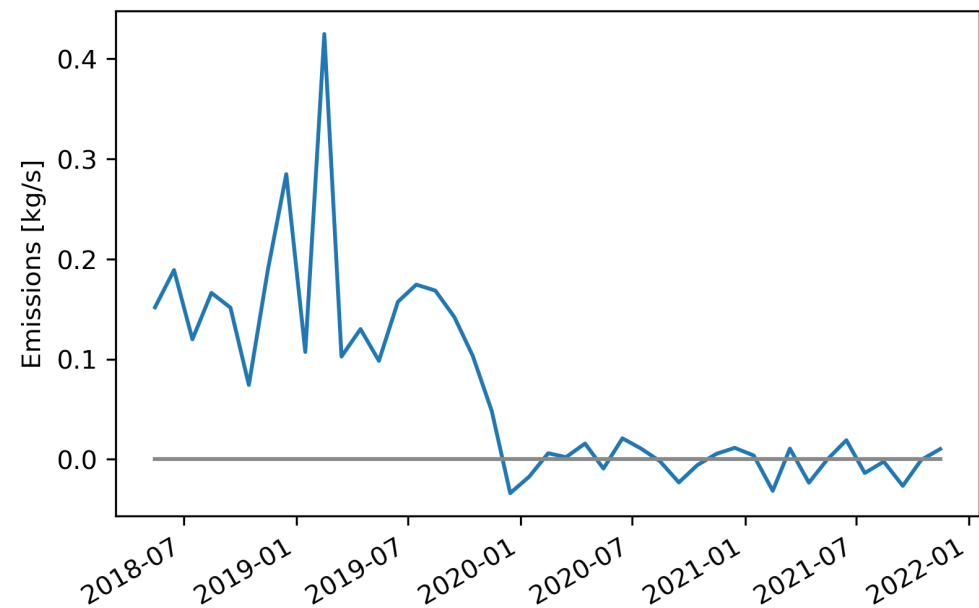
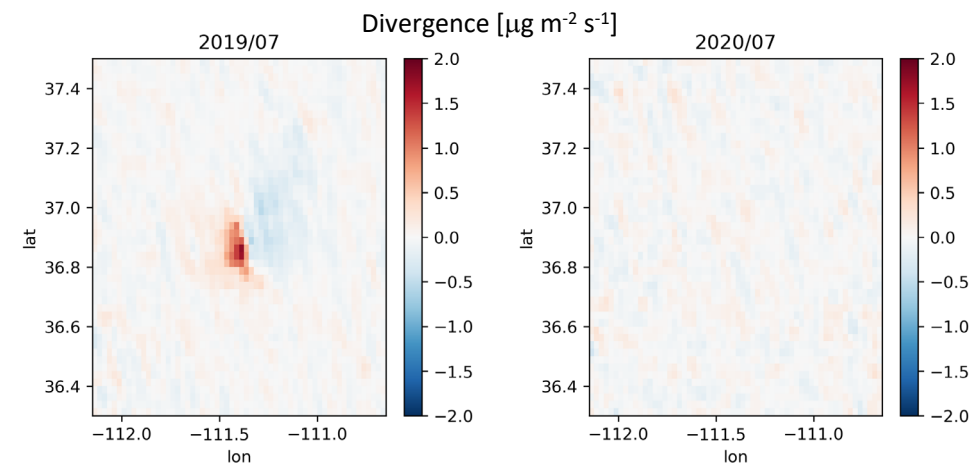
Long-running coal plant on Navajo Nation stops production

By FELICIA FONSECA November 19, 2019



<https://apnews.com/article/19487208f317460e9643f845e1440f65>

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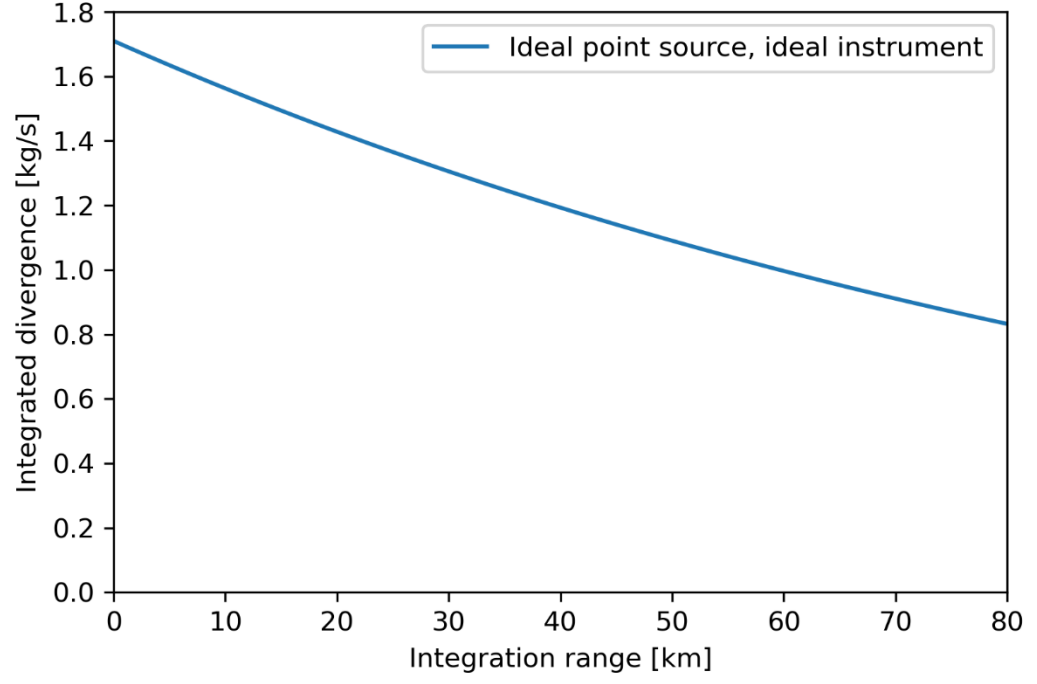
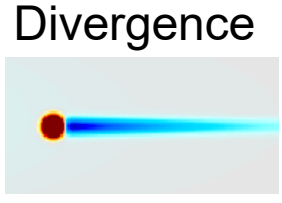
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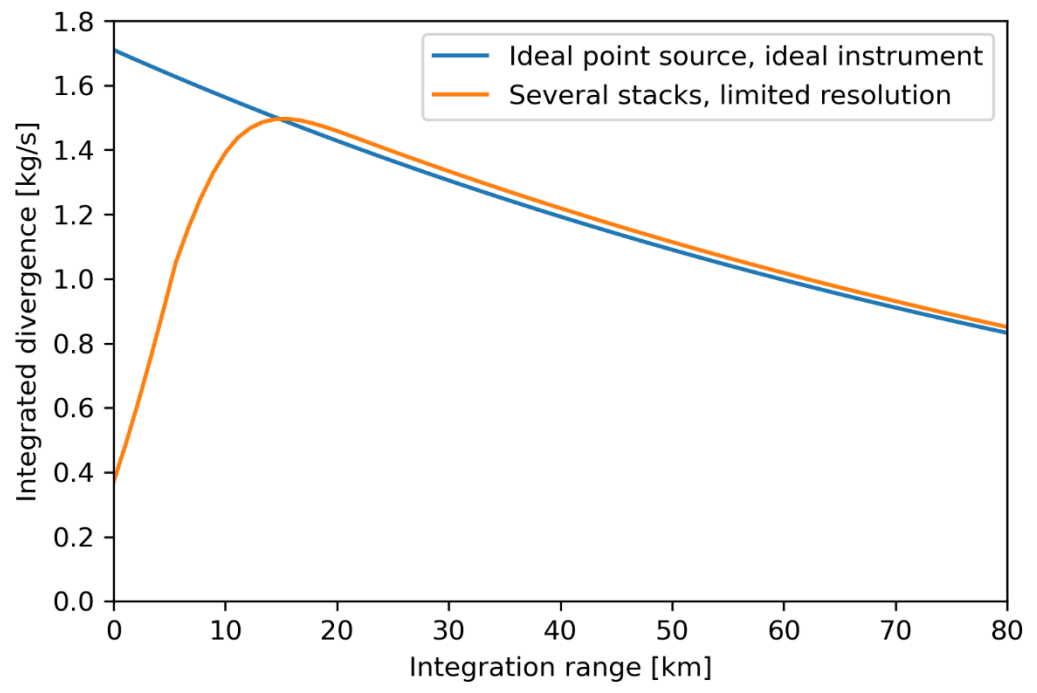
*Improved,
but still **too low!***

What is going wrong???

Checking the general approach



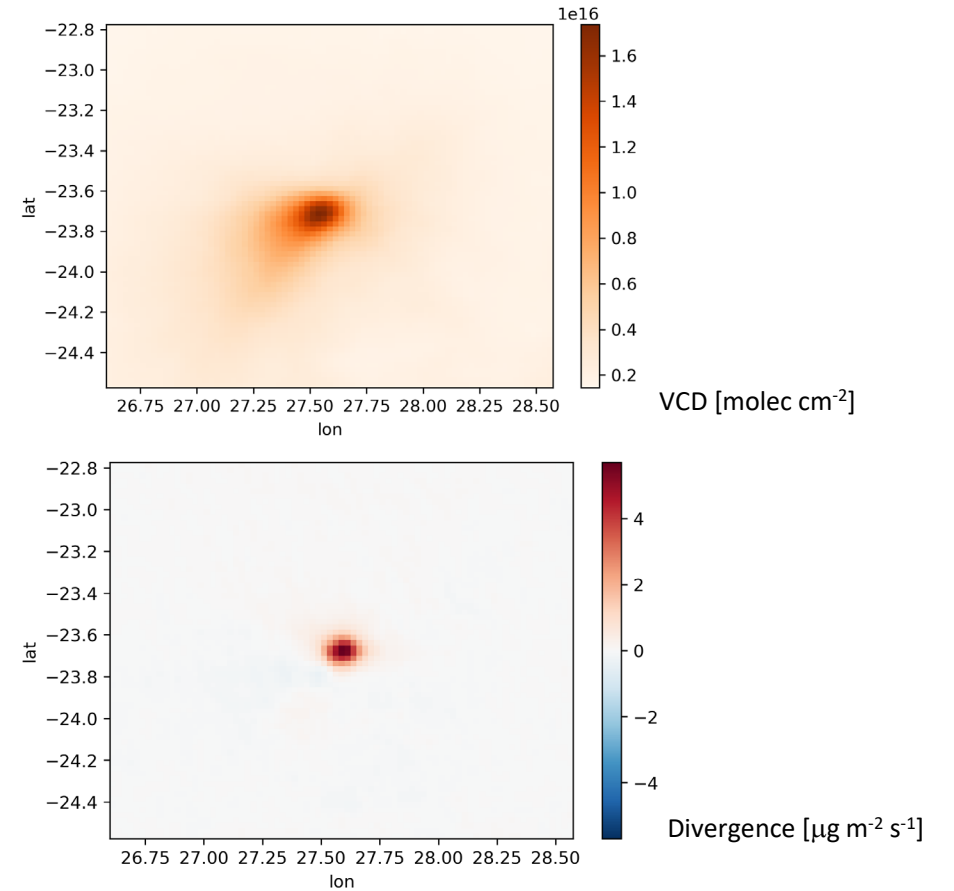
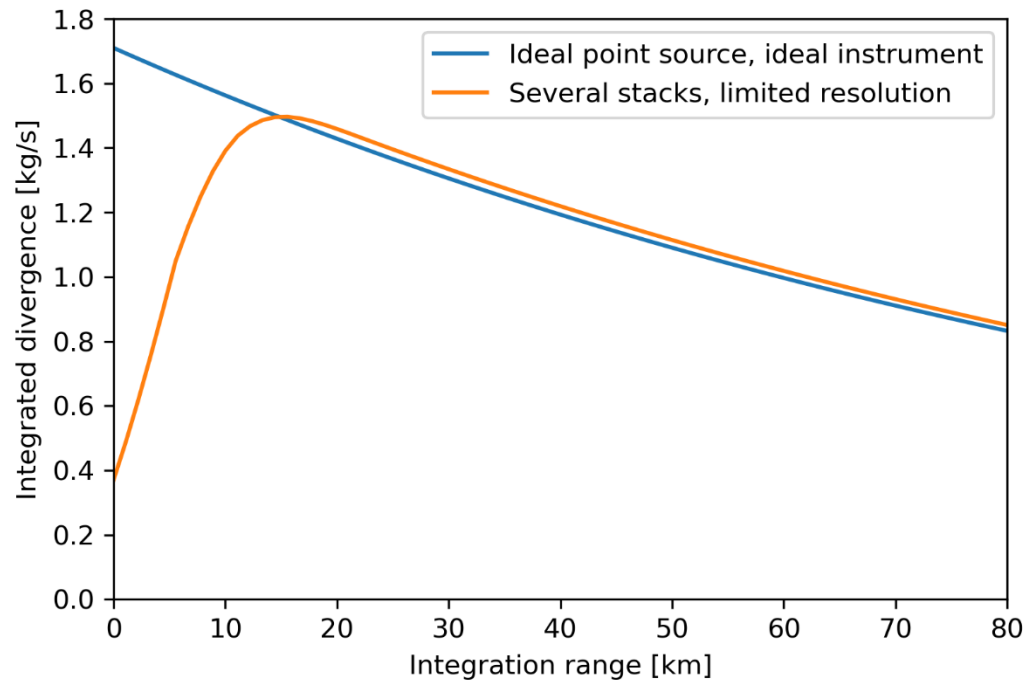
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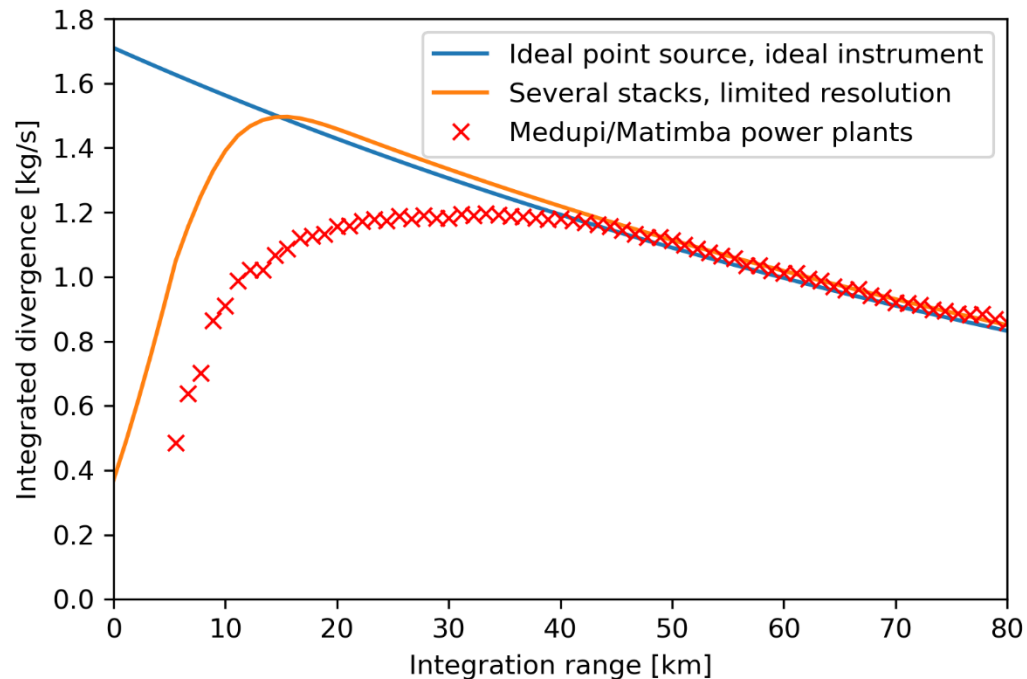


Isolated point source:
Medupi / Matimba
(South Africa)

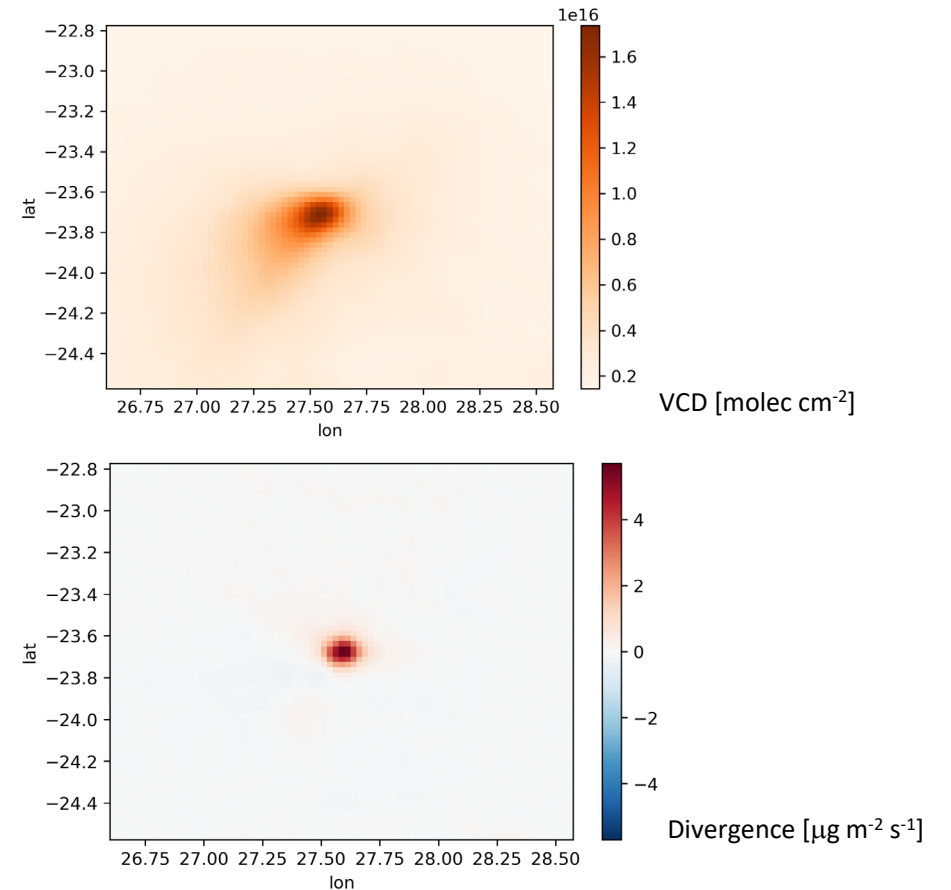


Checking the general approach

- Virtual source term ~20-40 km around the point source
- NO to NO₂ conversion?
- 3D effects on AMF (see Wagner et al., 11:25)
- Any other idea?



Isolated point source:
Medupi / Matimba
(South Africa)



Conclusions



- Divergence of NO_2 flux yields balance of NO_x sources and sinks
- Method is particularly sensitive for point sources:
 - Accurate localization
 - Detection of switch on / switch off on monthly basis
- Quantifying emissions:
 - Still tricky, work in progress
 - To start with: empirical correction factors?

Within the **ESA World Emission** project:

- Compile NO_x point source catalog v2
- Compile SO_2 point source catalog



**World
Emission**

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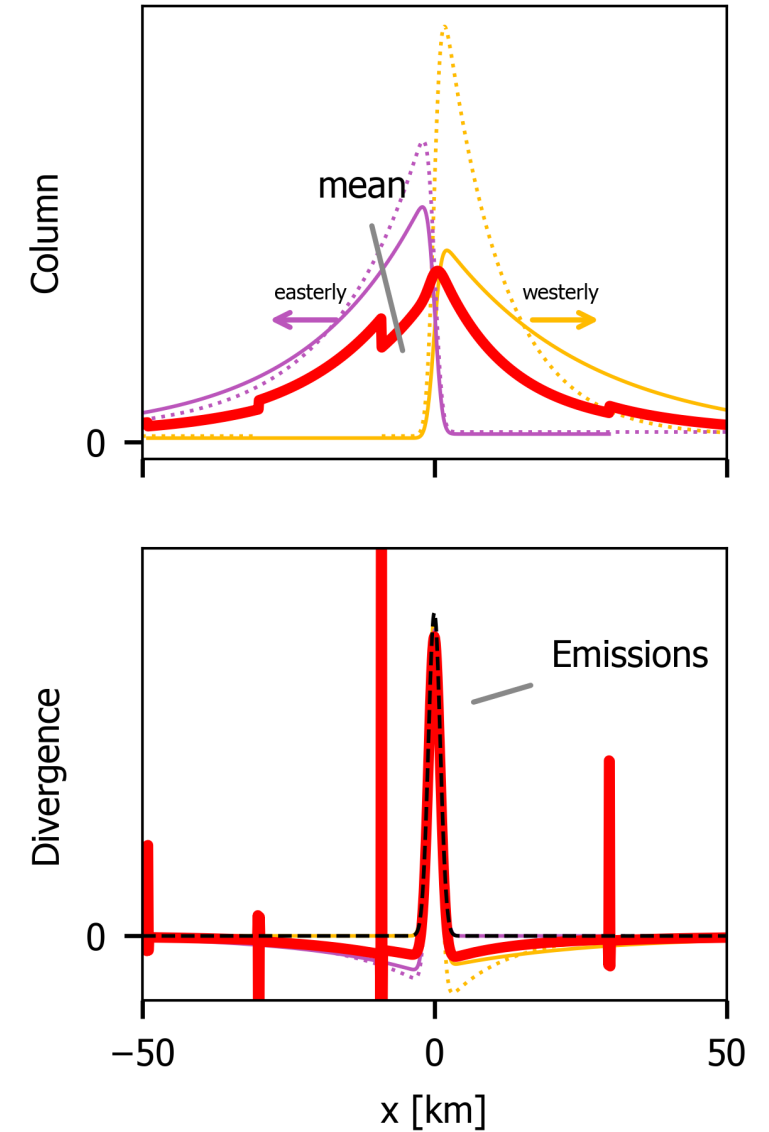
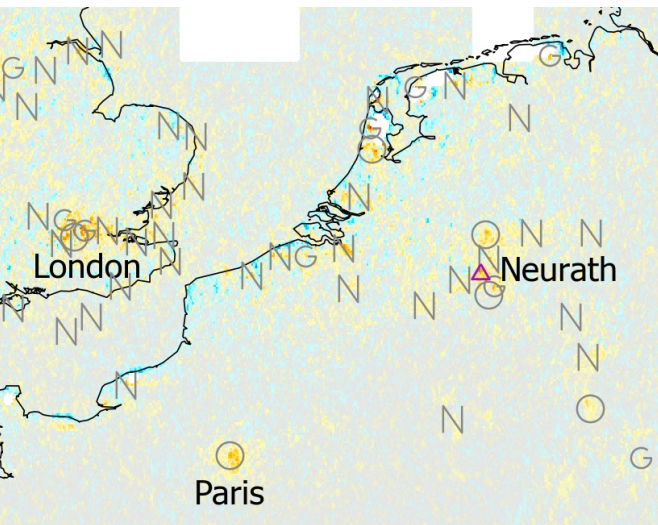
Supplement

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Noise in divergence

- Gaps due to cloud masking cause „jumps“ in mean VCD & mean flux
- Divergence (spatial derivative) results in spikes
- Effect stronger for
 - frequent cloud occurrence
 - polluted background
- Poor performance over e.g. Western Europe or China
- Longer time periods needed



Catalog of NO_x emissions from point sources as derived from the divergence of the NO_2 flux for TROPOMI

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Data

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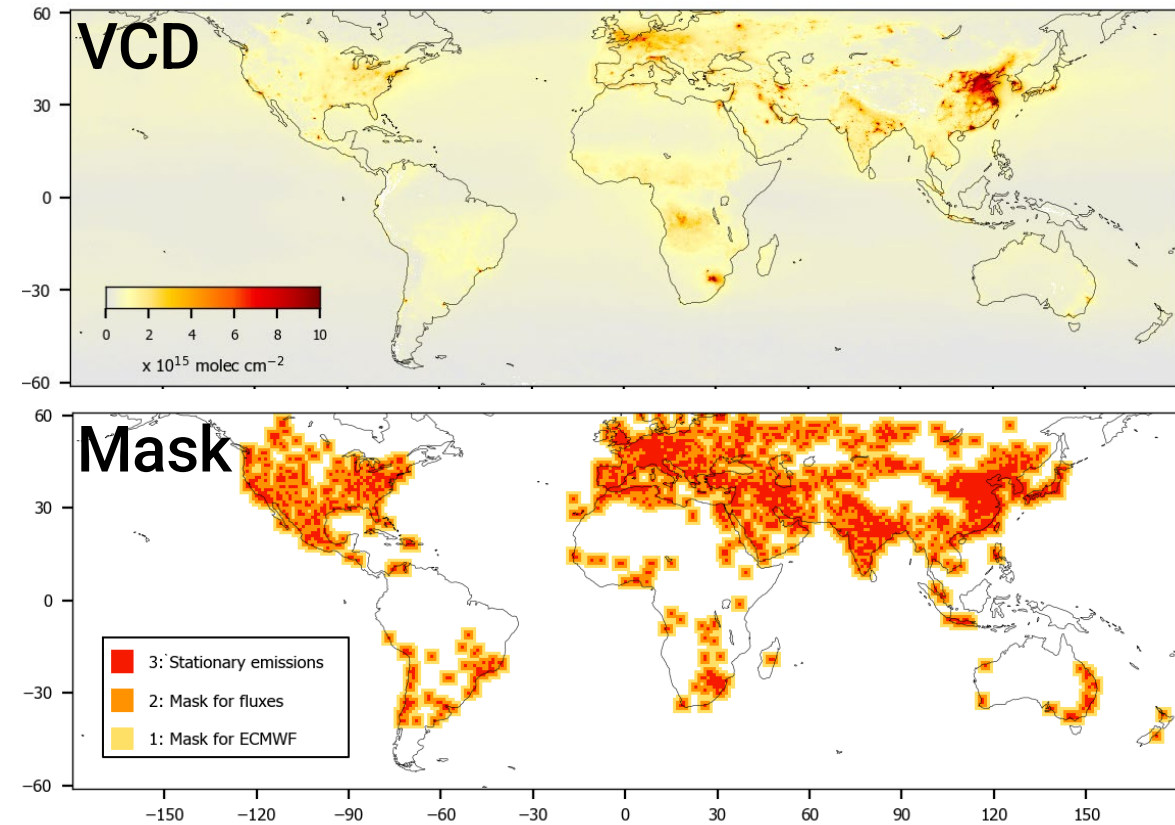


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<https://doi.org/10.5194/essd-13-2995-2021>

Method:

- Mask for potential stationary emissions
- Calculate mean fluxes and divergence
- Peak classification and point source emission fit by fully automated algorithm



NO_x/NO₂ ratio



- For quantification of NO_x emissions, information on the NO_x/NO₂ ratio is needed.
- In Beirle et al., 2019: constant (1.32)
- In Beirle et al., 2021: calculated from $J = f(\text{SZA})$ and [O₃] from model climatology
- Only moderate spatial variability:
Cloud free conditions around noon,
SZA < 65°
- In-plume NO_x/NO₂ ratio might be considerably higher (Ozone titration)
- In this case, the divergence method will „notice“ the NO_x source as soon as the NO is converted to NO₂, i.e. the peak in D would be shifted downwind
- For quantification of complete plume: „background“ ratio is appropriate
- On TROPOMI spatial resolution, we do not observe such a shift

