

Inversion of short lived pollutants in the global atmosphere using remote sensing data

Johann Rasmus Nüß
Nikos Daskalakis, Mihalis Vrekoussis

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Objective

Glyoxal

Inverse Modeling
4DVAR vs DA

TM5

Zooming

Summary & Outlook

Outline

Inversion of short lived pollutants in the global atmosphere using remote sensing data

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- 1 Objective
- 2 Glyoxal
- 3 Inverse Modeling
 - 4DVAR versus 3DVAR
- 4 TM5
- 5 Zooming
- 6 Summary & Outlook

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- Better estimate of global glyoxal fluxes from various local sources
- For the first time using Tropomi satellite data in TM5

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- Better estimate of global glyoxal fluxes from various local sources
 - For the first time using Tropomi satellite data in TM5
- Short lifetime requires high resolution (model and observations)
- 4DVAR approach versus Data Assimilation
- Multiple species influence one another

Glyoxal

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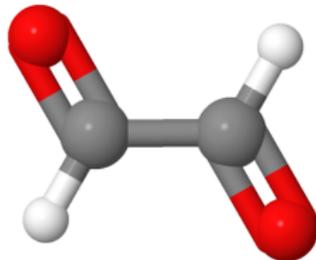
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Summary & Outlook

- Smallest dicarbonyl (CHOCHO)
- Formed by oxidation of hydrocarbons
- Mostly ($\approx 70\%^1$) natural origin
- Sinks:
 - photolysis (63 %¹)
 - OH (23 %¹)
 - wet/dry deposition (8 %/6 %¹)
 - Aerosol formation (??)
- Life time: ≈ 1.3 h in the sun², global mean 2.5 h to 3 h^{1,3}



¹Myriokefalitakis et al. 2008, ACP

²Volkamer et al. 2005, GRL

³Fu et al. 2008, JGR; Stavrou et al. 2009, ACP

Glyoxal observations

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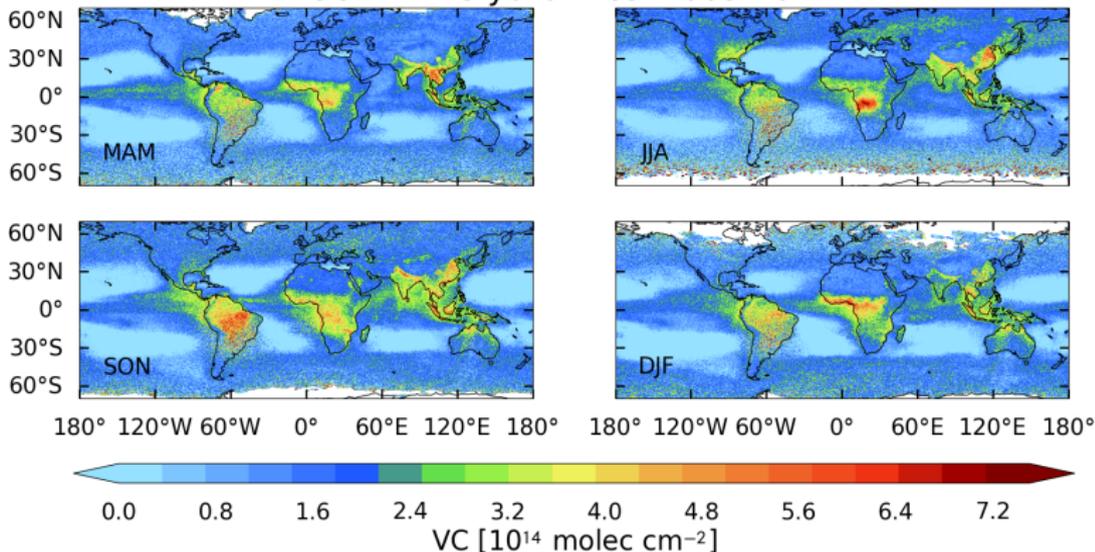
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Summary & Outlook

GOME2A Glyoxal VCs: 2005-2014



■ Elevated levels near...

■ Biomass burning

■ Dense vegetation

■ Anthropogenic emissions

Maps: Leonardo Alvarado (personal communication)

Glyoxal observations

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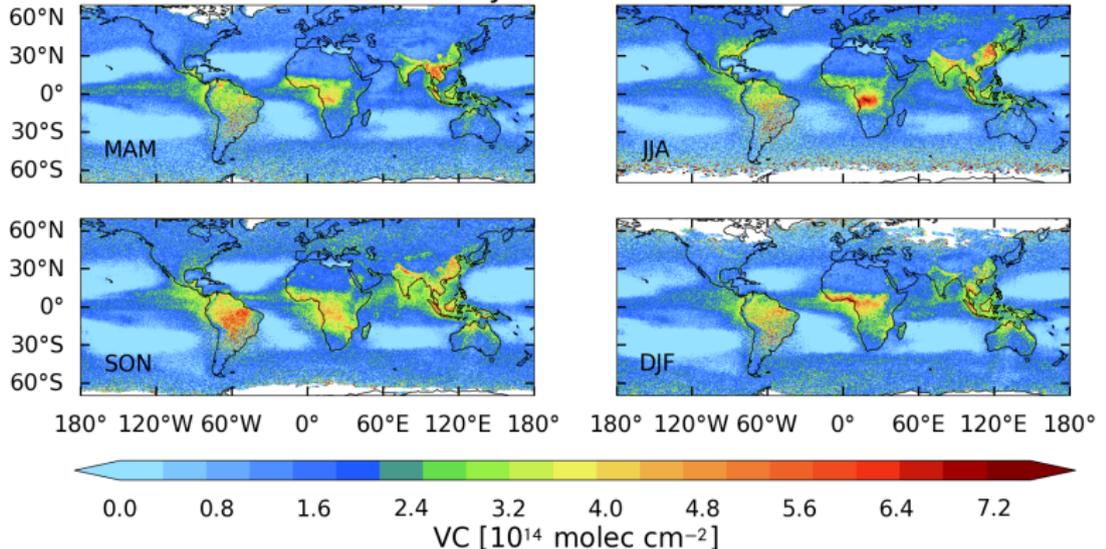
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GOME2A Glyoxal VCs: 2005-2014



■ Elevated levels near...

- Biomass burning
- Anthropogenic emissions
- Dense vegetation
- Over the remote ocean(!)

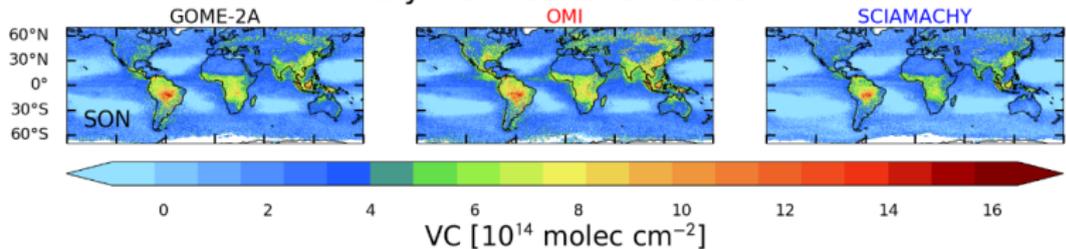
Maps: Leonardo Alvarado (personal communication)

Glyoxal over the ocean

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Glyoxal VCs: 2007-2010



- Observed in multiple satellite data sets
- Verified with ship based MAX-DOAS
- Close to upwelling areas and above areas with high phytoplankton concentrations, but not always
- Cannot be reproduced with models

Maps: Leonardo Alvarado (personal communication)

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Glyoxal over the ocean - Modeling

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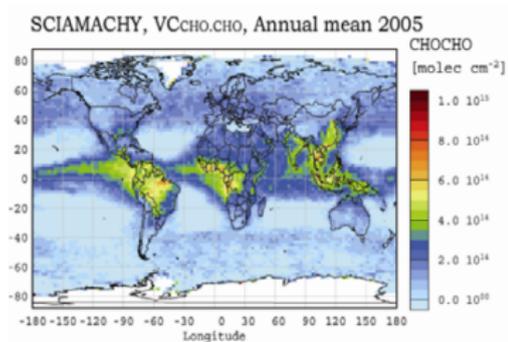
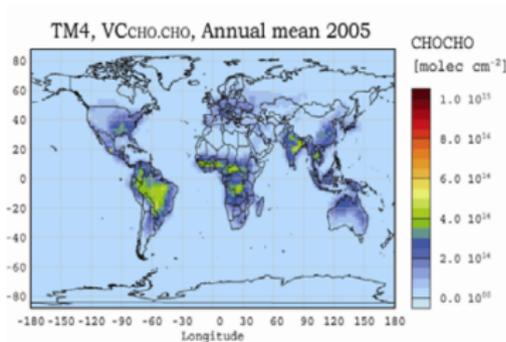
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Glyoxal over the ocean - Suggested Explanations

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Summary &
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- Concentration peaks in afternoon → likely photochemistry
 - Unknown local source?
 - Long range transport of acetylene and acetone?
- Uptake, transport and re-release via unknown secondary organic aerosol?
- Outflow of longer lived continental isoprene → does not fit patterns

Inverse Modeling

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**Inverse
Modeling**

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Find the state that minimizes the difference between a set of observations and a model that links the state to the observations.

Inverse Modeling - Mathematical description

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- Forward model \mathbf{F} with parameters \vec{p} links state \vec{x} to observation \vec{y}

$$\vec{y} = \mathbf{F}(\vec{x}, \vec{p})$$

- Inversion (of \mathbf{F}): get cause \vec{x} from observation \vec{y}

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Summary & Outlook

- Forward model \mathbf{F} with parameters \vec{p} links state \vec{x} to observation \vec{y}

$$\vec{y} = \mathbf{F}(\vec{x}, \vec{p}) + \vec{\epsilon}_O$$

with observational error $\vec{\epsilon}_O$ (error of measurements, model, and parameters)

- Inversion (of \mathbf{F}): get cause \vec{x} from observation \vec{y}

Inverse Modeling - Cost function

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- Least squares approach
- Assume a priori state \vec{x}_A
- Error covariance matrices \mathbf{S}_O and \mathbf{S}_A

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$$J(\vec{x}) = \quad +$$

$$\text{Cost} = \quad +$$

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$$J(\vec{x}) = (\vec{x} - \vec{x}_A)^T \mathbf{S}_A^{-1} (\vec{x} - \vec{x}_A) +$$

$$\text{Cost} = \frac{(\text{state-a priori})^2}{\text{error}_{\text{apri}}} +$$

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$$J(\vec{x}) = (\vec{x} - \vec{x}_A)^T \mathbf{S}_A^{-1} (\vec{x} - \vec{x}_A) + (\vec{y} - \mathbf{F}(\vec{x}))^T \mathbf{S}_O^{-1} (\vec{y} - \mathbf{F}(\vec{x}))$$
$$\text{Cost} = \frac{(\text{state-a priori})^2}{\text{error}_{\text{apri}}} + \frac{(\text{obs-model})^2}{\text{error}_{\text{obs}}}$$

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Assimilation

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Concrete applications to evaluate the cost function for given observations

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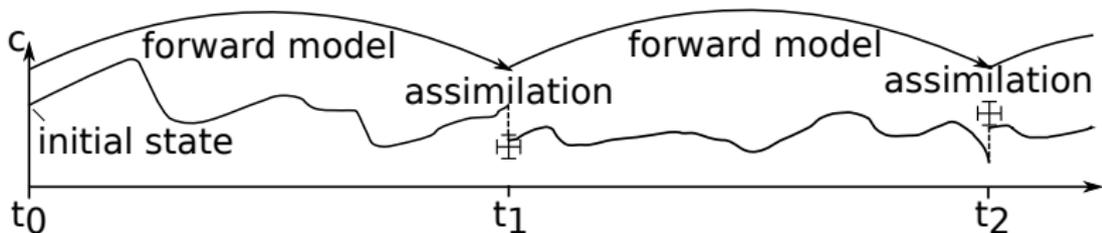
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Assimilation - 3DVAR

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- Assimilate data *at* a single point in time, *after* a fixed time step
- Optimizes only the result and only in space (but not time)
 - Optimizer does not need forward model

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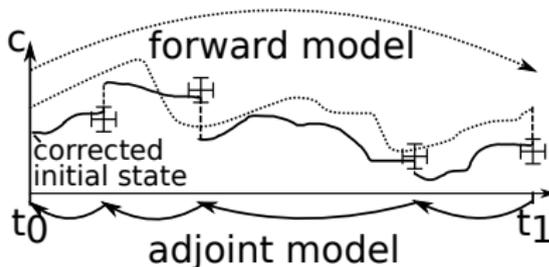
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Assimilation - 4DVAR

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- Assimilate data *spread* over the time step, *back* to its starting point
- Optimizes in space *and* time

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Summary & Outlook

- 3D, global CTM
- Well established and documented
- Handles different in situ and satellite datasets
- Capable of 4DVAR or 3DVAR (CTDAS)
- Zooming

Zooming

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Summary & Outlook

- Aim: Model chemistry on arbitrarily large domain

Zooming

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Summary & Outlook

- Aim: Model chemistry on arbitrarily large domain
- Problems:
 - High resolution → high computational demands
 - Low resolution → bad representation of local processes

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Summary & Outlook

- Aim: Model chemistry on arbitrarily large domain
 - Problems:
 - High resolution → high computational demands
 - Low resolution → bad representation of local processes
 - Numerical Dilution
 - Non-linear chemistry
 - Transport
- All especially relevant for short lived species

Zooming

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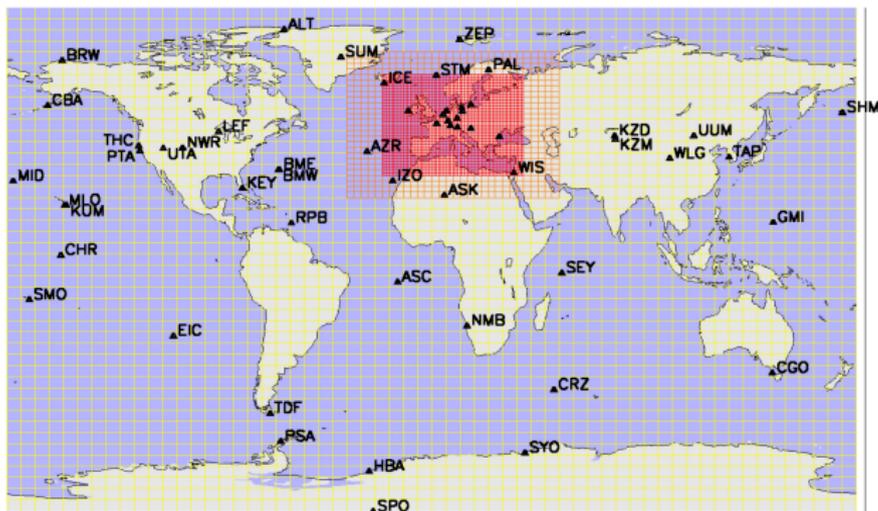
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- Aim: Model chemistry on arbitrarily large domain
- Problems:
 - High resolution → high computational demands
 - Low resolution → bad representation of local processes
 - Numerical Dilution
 - Non-linear chemistry
 - Transport
 - All especially relevant for short lived species
- Solution: Use low resolution where possible and high resolution only where necessary

Zooming - Pros and Cons

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- Straightforward: increase resolution in region of interest

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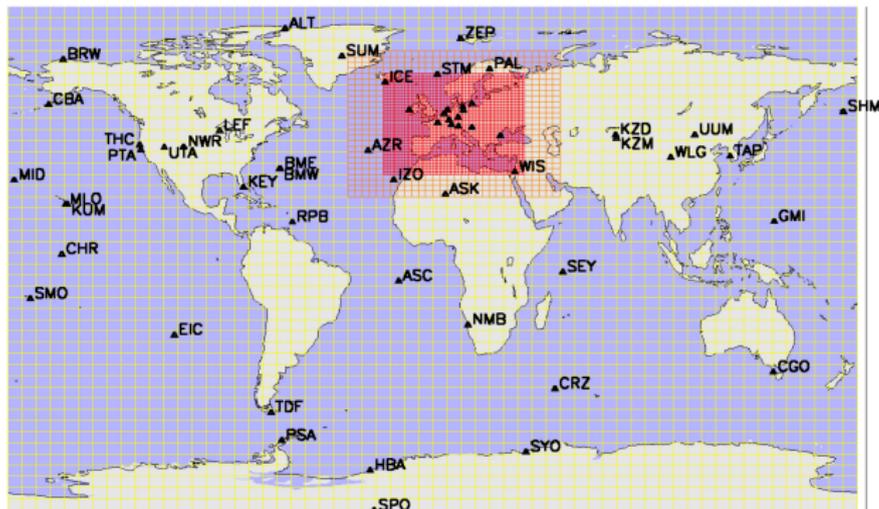
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Zooming - Pros and Cons

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- Straightforward: increase resolution in region of interest
- + Results close to full high resolution run and much faster

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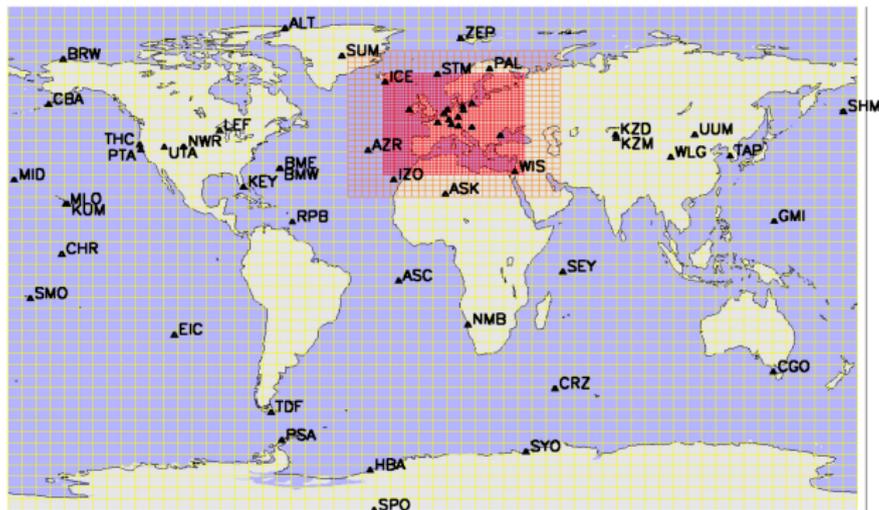
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- Straightforward: increase resolution in region of interest
- + Results close to full high resolution run and much faster
- Still limited by grid box size

Image: Bergamaschi et al. 2005, ACP

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- Glyoxal as short-lived tracer with unknown fluxes

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- Increase zooming capabilities of TM5 to at least $0.5^\circ \times 0.5^\circ$

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- Implement inversion schemes for CHOCHO, HCHO and NO_2

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- Extend to handle multi-tracer inversion

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- Case studies for each to verify

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- Start using S5P data
- Implement inversion schemes for CHOCHO, HCHO and NO_2
- Extend to handle multi-tracer inversion
- Case studies for each to verify
- Compare results to CTDAS

Acknowledgments

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- The computations were performed on the HPC cluster Aether at the University of Bremen, financed by DFG in the scope of the Excellence Initiative.
- the PhD position is paid for by the University Bremen.
- Thank you to the LAMOS group, especially Nikos and Mihalis.
- Special thanks to Leonardo Alvarado for the quick provision of the glyoxal maps.

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Thank you!

... to be continued ...