



# Finnish perspective on aerosol research

**Harri Kokkola**

**+ contribution from**

- University of Helsinki
- University of Eastern Finland
- Finnish Meteorological Institute
- University of Oulu
- Finnish Environment Institute

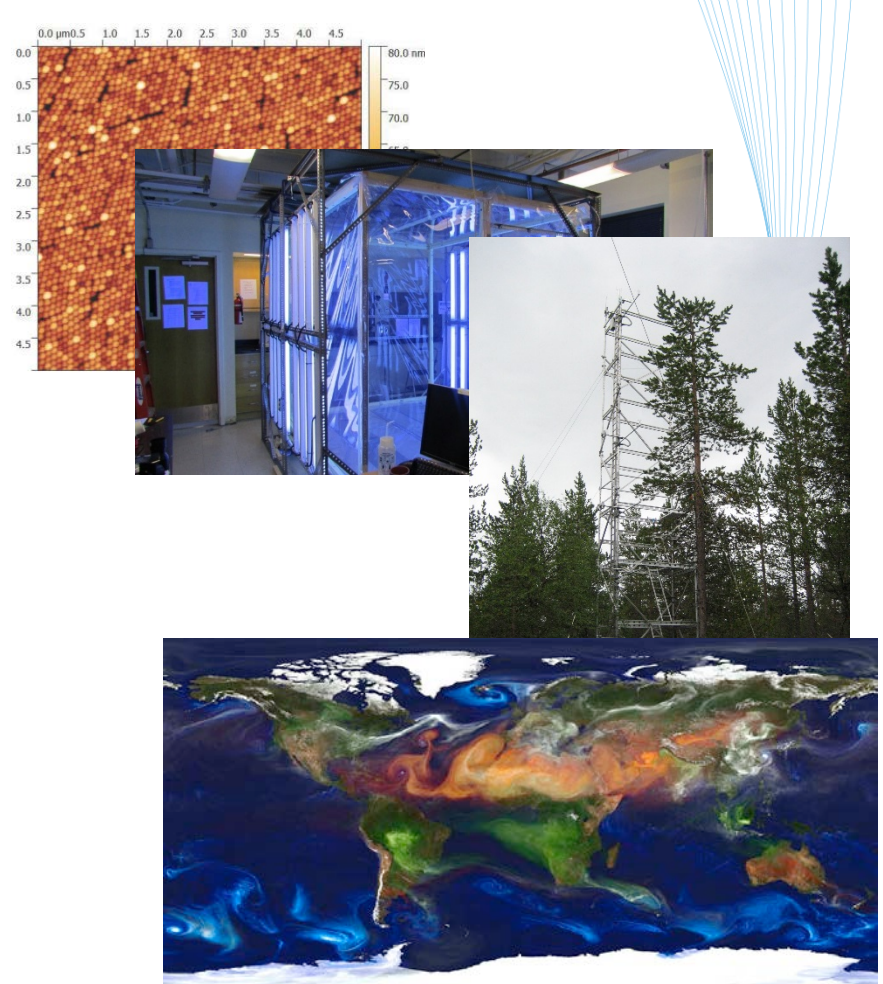
# Finnish aerosol research

- First steps towards systematic research of atmospheric aerosol in 1980's
  - Additional motivation from the Chernobyl 1986 nuclear accident



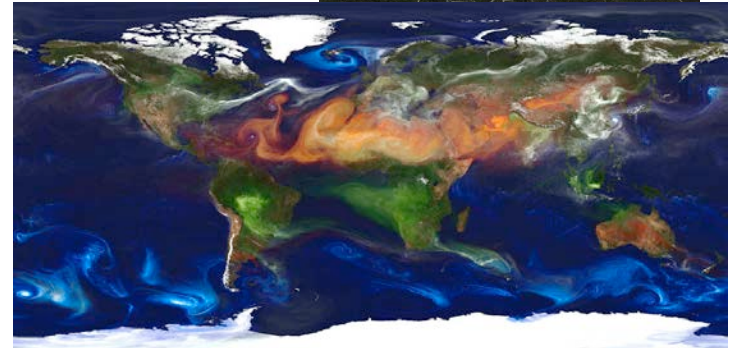
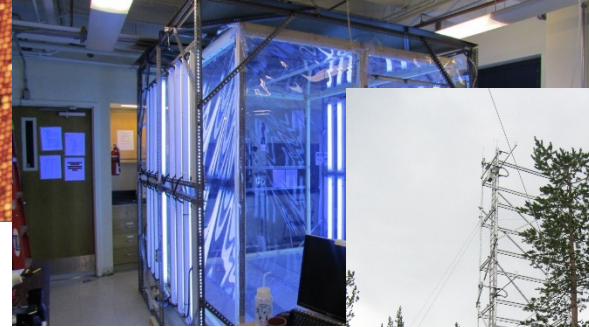
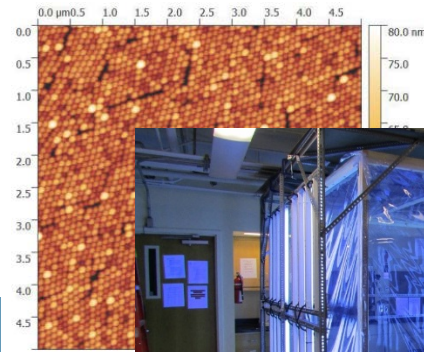
# Finnish aerosol research

- Quick progress to extensive research in:
  - industrial nanoparticles
  - laboratory measurements
  - field observations
  - remote sensing
    - ground-based, satellite-based
  - modelling
    - from molecular scale to global scale



# Institutes

- University of Helsinki
- University of Eastern Finland
- Finnish Meteorological Institute
- Tampere University of Technology
- VTT Technical Research Centre of Finland
- University of Oulu
- Finnish Environment Institute
- National Institute for Health and Welfare





# Finnish Center of Excellence in Atmospheric Sciences

Atmosphere – biosphere feedback

**From 1986 to 2017**

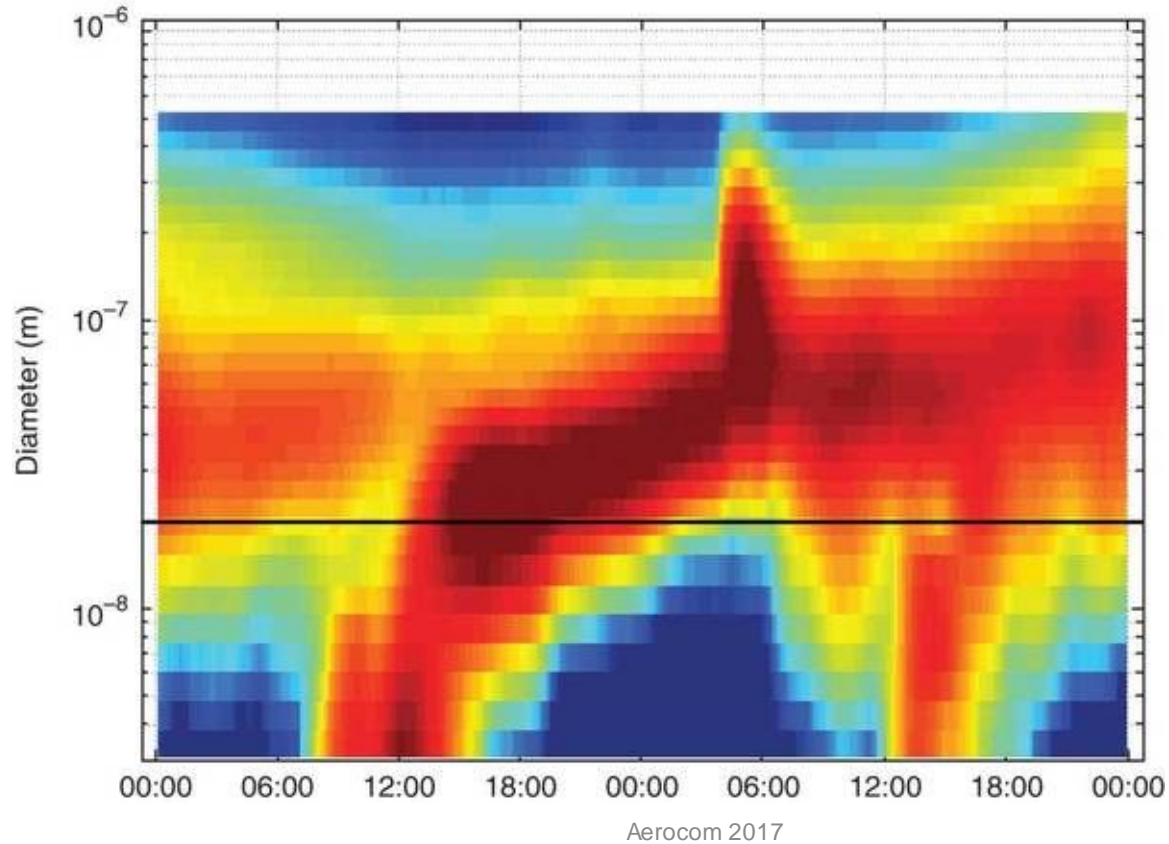
- 5 -> 250 persons years
- Budget: 0.05 -> 15 Meuro
- Infra: 0 -> SMEARs, P-S, ICOS, (ACTRIS), (ANAEE)
- Productivity: 0 -> 150/200 (2-6) papers (in ISI)
- 5/16 ISI Highly Cited Scientists in Finland
- Ca 10% of Nature and Science papers in Finland per year
- 14 ERCs (Finland ca 125 )

**Core expertise in process scale**

# Global aerosol-modelling

- COSMOS project 2003
- ECHAM-HAMMOZ/MPI-ESM (SALSA for AeroCom)
- NorESM
- EC Earth (CMIP6, AerChemMIP)

# Global nucleation

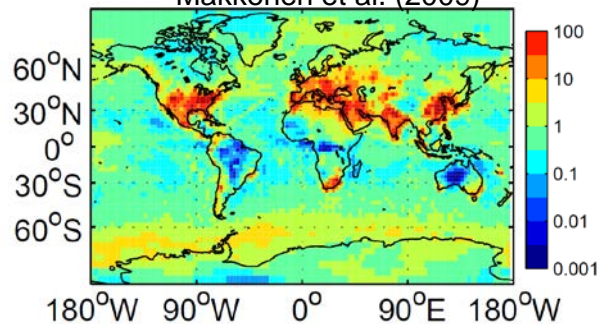




# Global nucleation

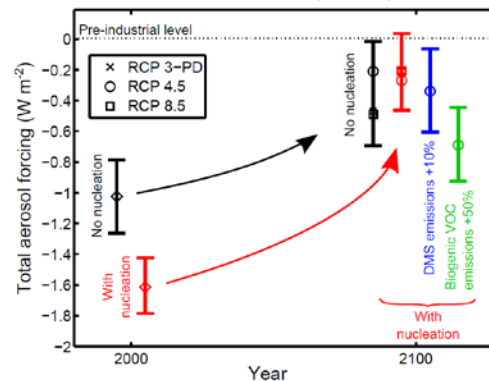
## Global nucleation rates (ECHAM-HAM)

Makkonen et al. (2009)



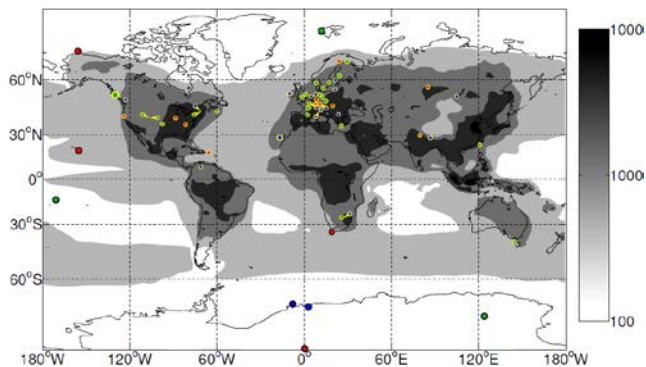
## Climate impact of nucleation (ECHAM-HAM)

Makkonen et al. (2012)



## Improved number concentrations with explicit nucleation (NorESM)

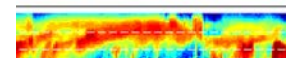
Makkonen et al. (2014)



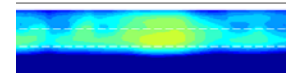
## Nucleation in EC-Earth-AerChemMIP (Poster P38)

Pallas

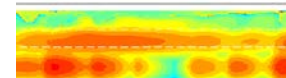
Observation



Without nucleation



Effect of nucleation





# Satellites / remote sensing

- Started ~ 2006 both in Helsinki & Kuopio
- **AATSR**
- **MODIS**
- MISR
- OMI
- CALIPSO
- AERONET
- SLSTR (Sentinel 3)

# How useful are they?

- Global aerosol-climate models
  - should they reproduce e.g. field observations?
  - future predicting crystal balls?
- Satellite data too uncertain to be useful?
  - what data to use and how?
    - anomalies, trends?
    - satellites + models together

# Model experiments

# RECIA = REgional Climate Impacts of anthropogenic Aerosols



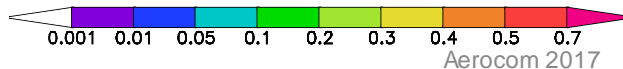
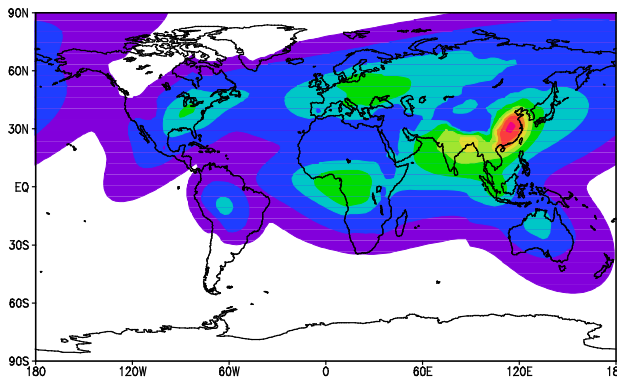
ILMATIETEEN LAITOS  
METEOROLOGISKA INSTITUTET  
FINNISH METEOROLOGICAL INSTITUTE

- Ongoing project to identify robust regional climate effects of anthropogenic aerosols **with three climate models**:

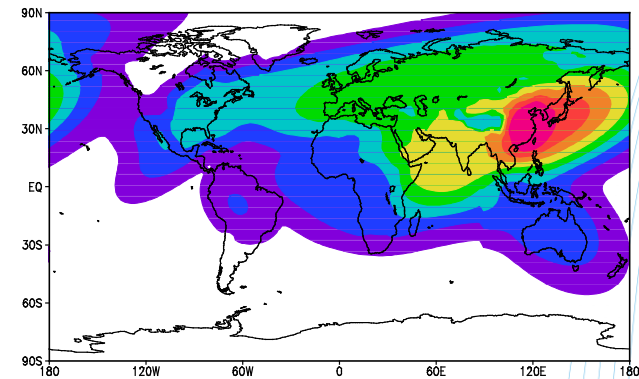
= ECHAM6 / MPI-ESM, NorESM, EC-Earth (to be included later)

- How similar are regional responses to modern day aerosols when **using a standardized aerosol climatology** (taken from MACv2-SP)?

2005 mean AOD enhancement ( $0.55 \mu\text{m}$ )



2005 CDNC multiplication factor



**MACv2-SP approach: model-specific background AOD and CDNC are enhanced in anthropogenic aerosol plumes**

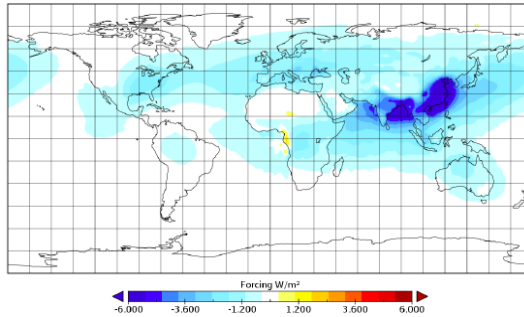
Stevens et al., *Geosci. Model. Dev.*, 2017: **MACv2-SP**: a parameterization of anthropogenic aerosol optical properties and an associated Twomey effect for use in CMIP6



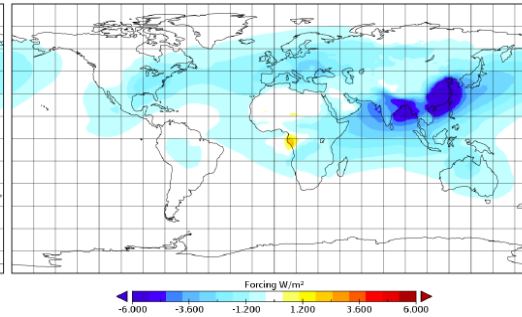
# RECIA : Aerosol forcing to Temperature response

- MACv2-SP aerosol climatology results in near identical aerosol forcing across models - below is the instantaneous TOA (direct + 1st indirect) short wave **anthropogenic aerosol forcing** from ECHAM6 and NorESM:

**ECHAM6: global mean -0.63 W/m<sup>2</sup>**

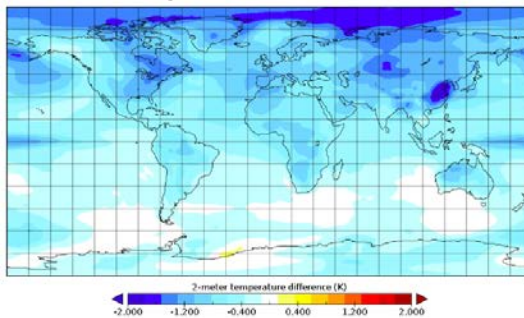


**NorESM: global mean -0.66 W/m<sup>2</sup>**

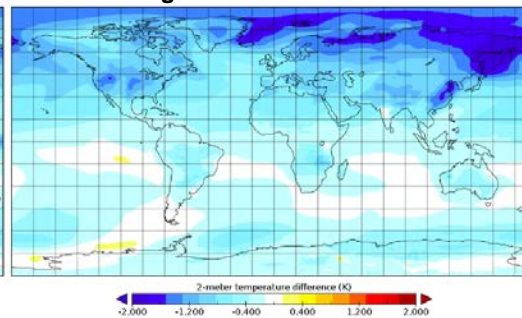


- The resulting **atmospheric cooling** (from year 2005 slab ocean runs with and without anthropogenic aerosols) correlates very little with the original forcing:

**ECHAM6: global mean  $\Delta T=0.55$  K**



**NorESM: global mean  $\Delta T=0.49$  K**

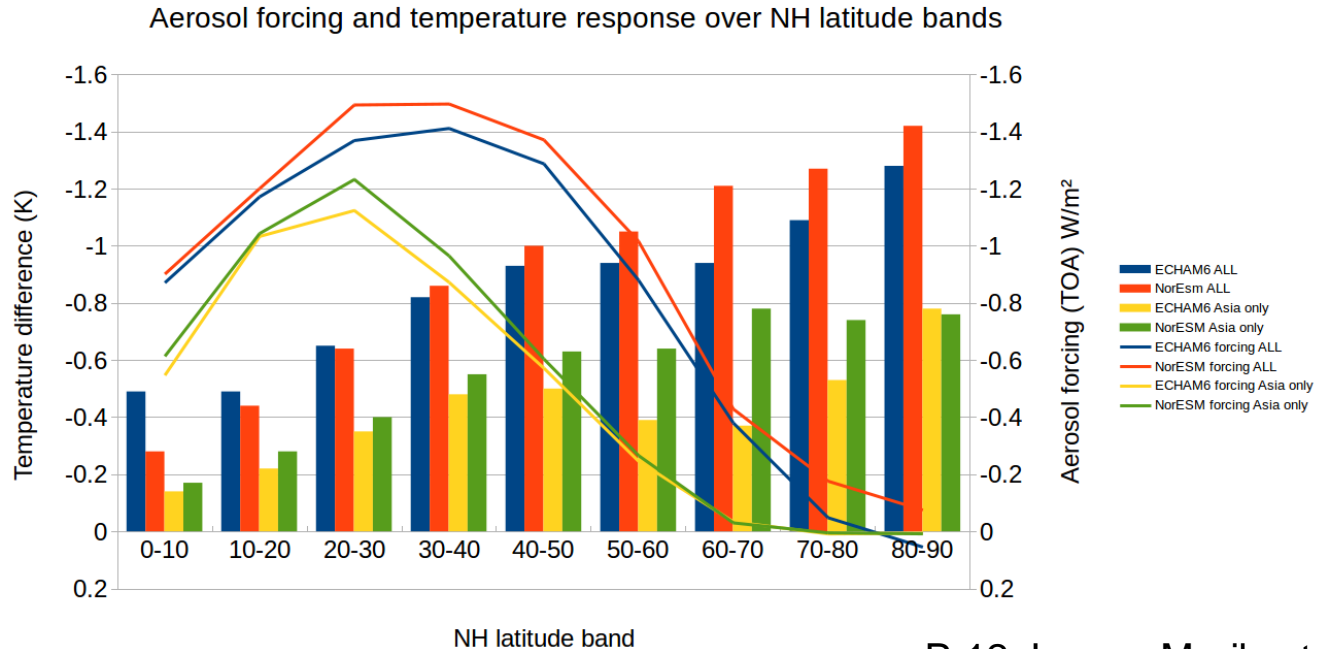




# RECIA : Arctic amplification in temperature response

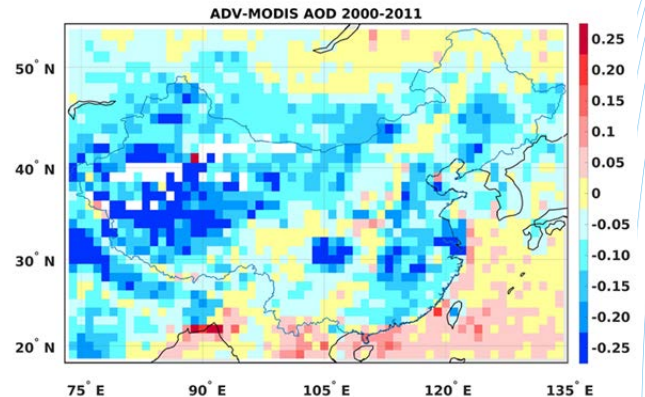
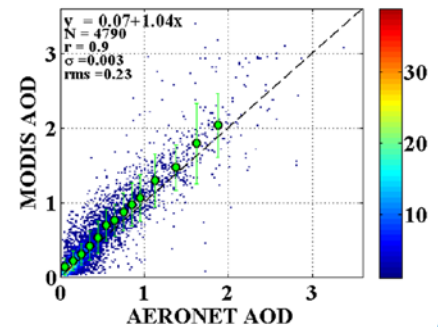
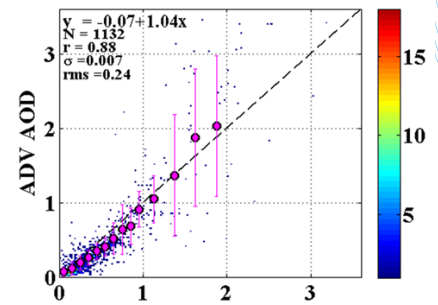
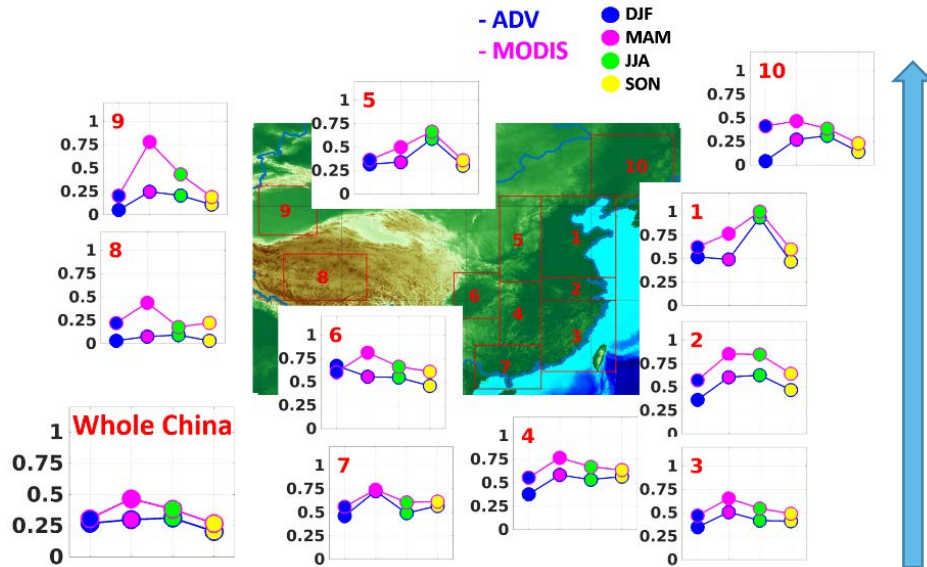
- ECHAM6 and NorESM slab ocean runs show **strong arctic amplification** of atmospheric cooling due to modern day anthropogenic aerosols (red and blue bars).
- Arctic amplification is also present when only Asian aerosols are taken into account

**Forcing and temperature response over different NH latitudes: Lines represent forcing, bars are the corresponding temperature difference between different runs**



# Satellite data

# AOD over China from ATSR-2, AATSR and MODIS: seasonality



Seasonal variation varies by region;

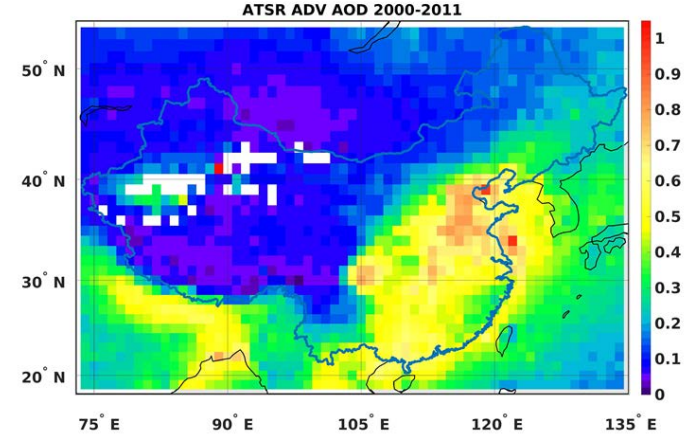
- tendency similar for MODIS (C6 DTDB merged) and ATSR
- MODIS overestimates, ATSR underestimates
- ATSR has problems over bright surface where MODIS uses DB



# AOD over China from ATSR-2, AATSR and MODIS: time series

Mainland China: yearly AOD

ATSR-2 + AATSR 2000-2011  
L3 (1° x 1°)



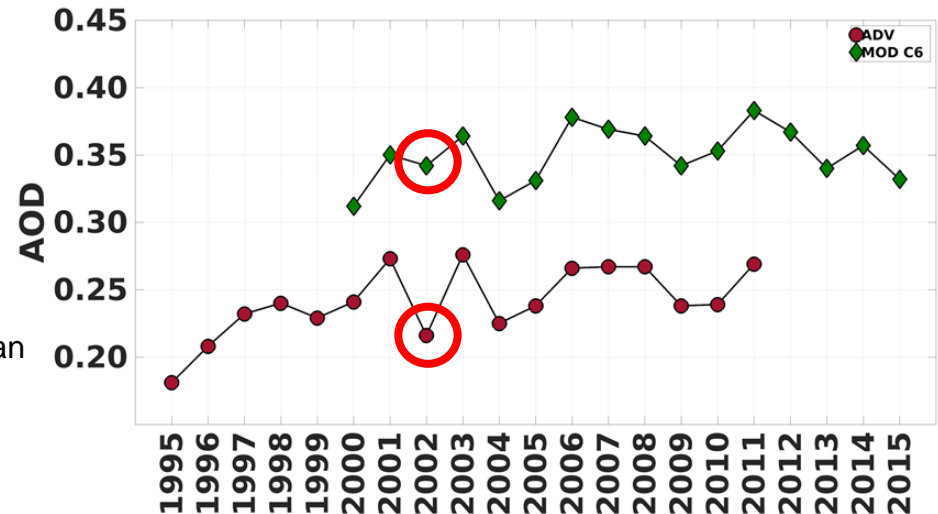
ATSR & MODIS/Terra C6 are complementary:

- ATSR shows the AOD increase before the EOS era
- MODIS/Terra shows the AOD decrease after ENVISAT, in response to emission reductions

Two questions:

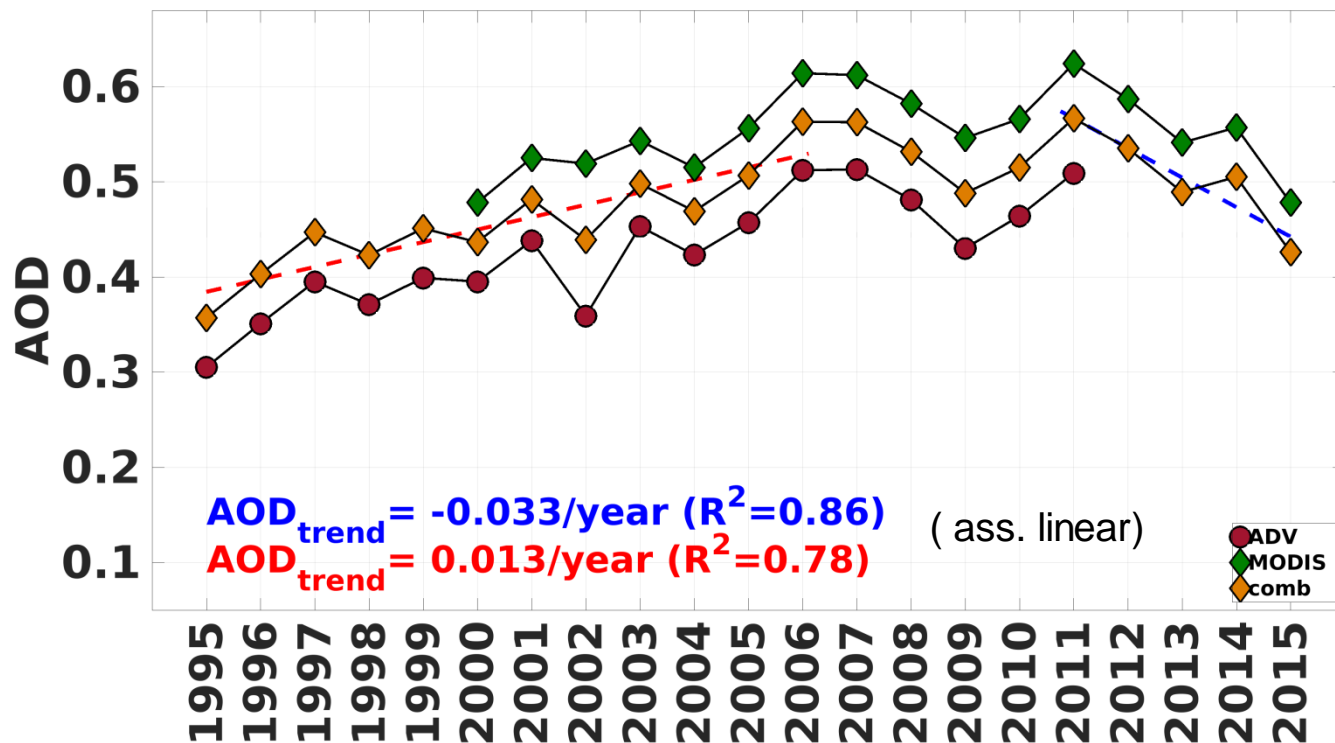
- 1) ATSR&MODIS are substantially different, can they be used together?
- 2) How effective are emission reductions?

de Leeuw et al., submitted



C6 DT expected error over land:  $\pm(0.05+0.15T_{\text{AERONET}})$

# AOD over China from ATSR-2, AATSR and MODIS: combined time series



Initial increase  
Followed by a decrease from  
~2011

Linear fits?  
Different factors contribute to  
the temporal variations

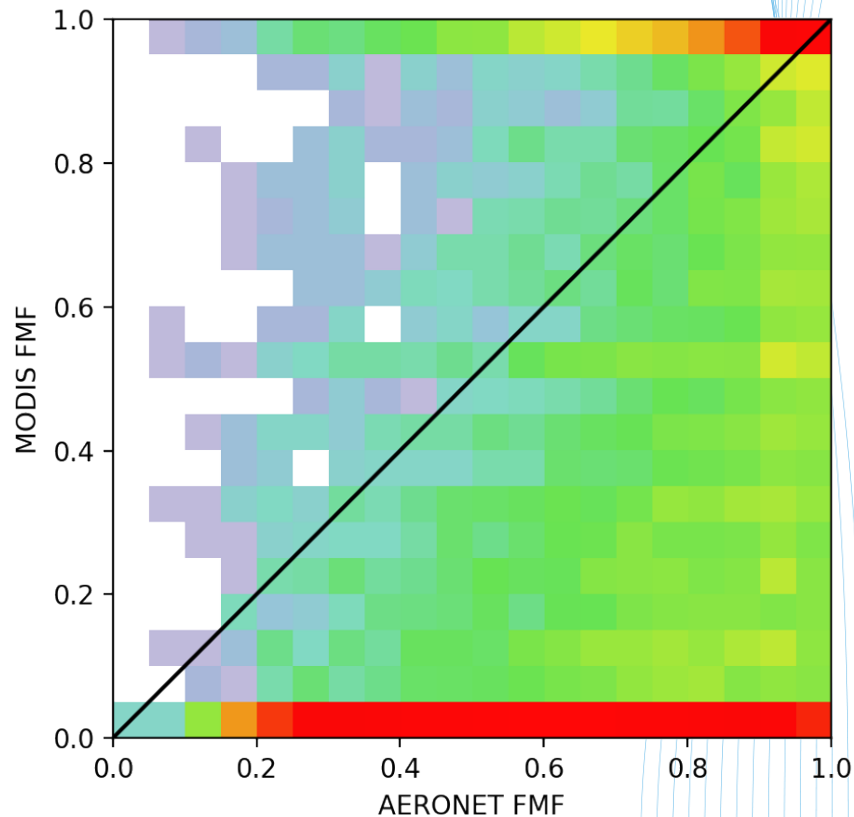
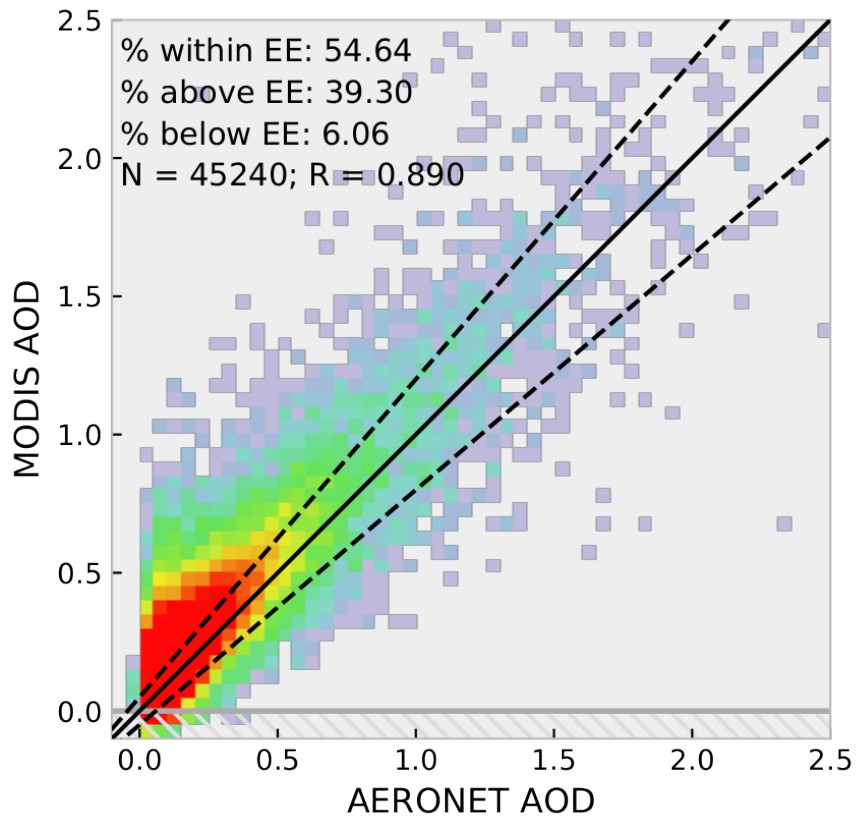
Sogacheva et al., in prep.

P-64 Larisa Sogacheva

# MODIS Bayesian Dark Target algorithm

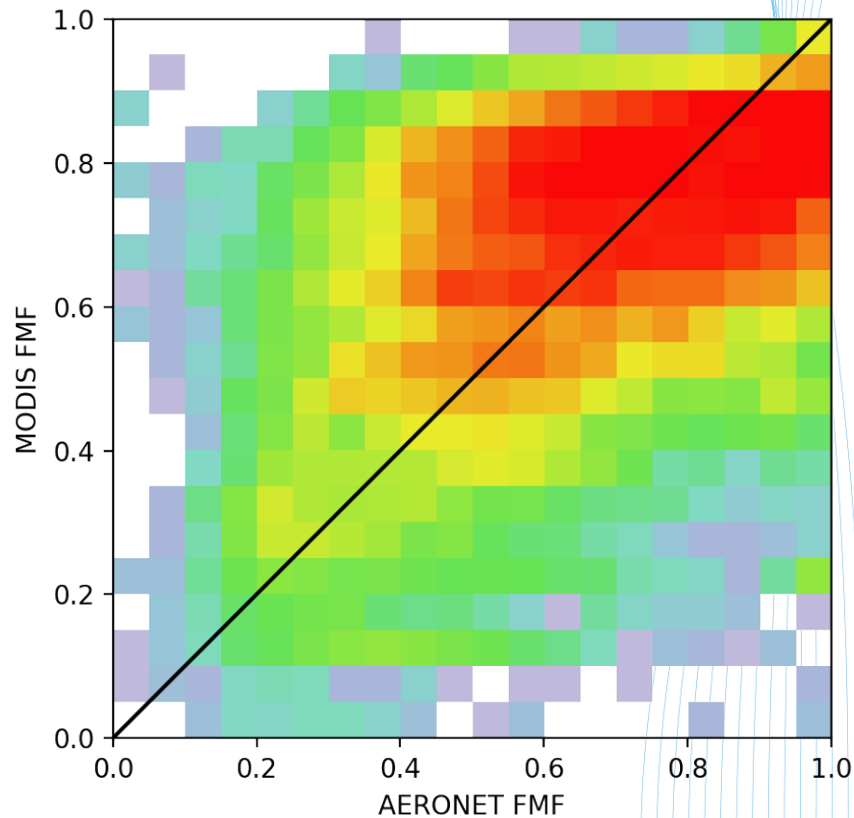
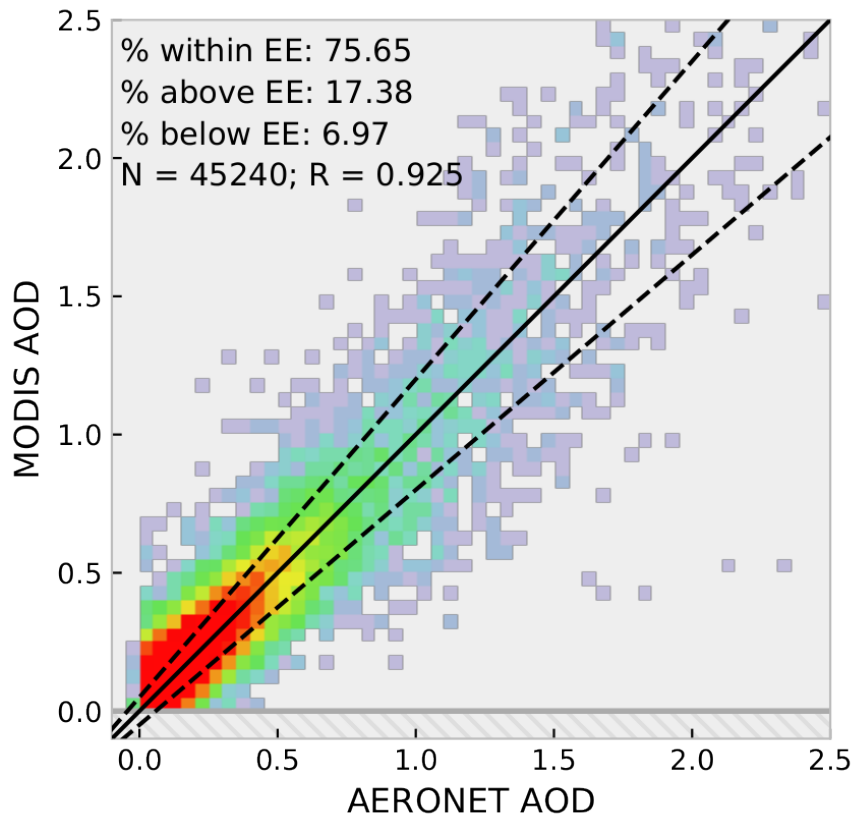
- Bayesian Dark Target (over land)
  - Based on Dark Target over land algorithm
  - Retrieves AOD, fine mode fraction and surface reflectances
  - Quantifies uncertainties related to retrievals on a pixel level
  - Multipixel retrieval (simultaneous retrieval of all pixels in a granule)
  - Spatial correlation models
  - Approximation error model / Uncertainty model for the aerosol models and radiative transfer simulations
  - Significantly improved retrieval accuracy, computationally feasible for near-realtime retrievals

# MODIS Dark Target Algorithm

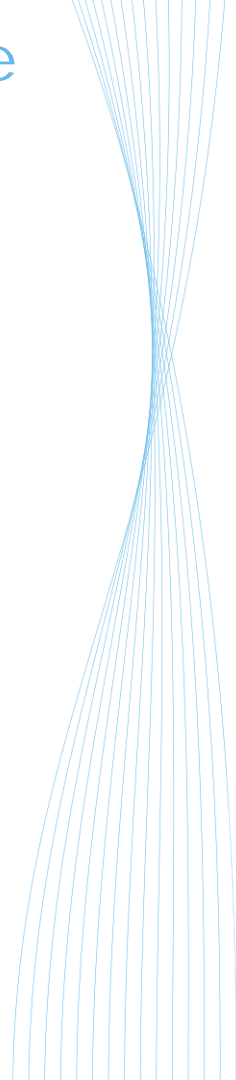
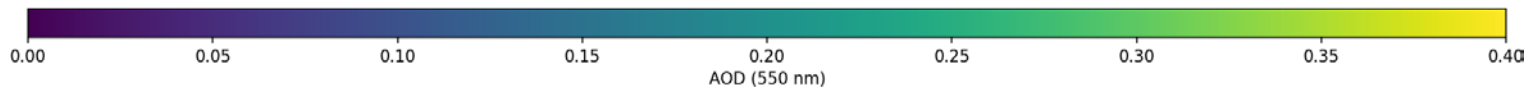
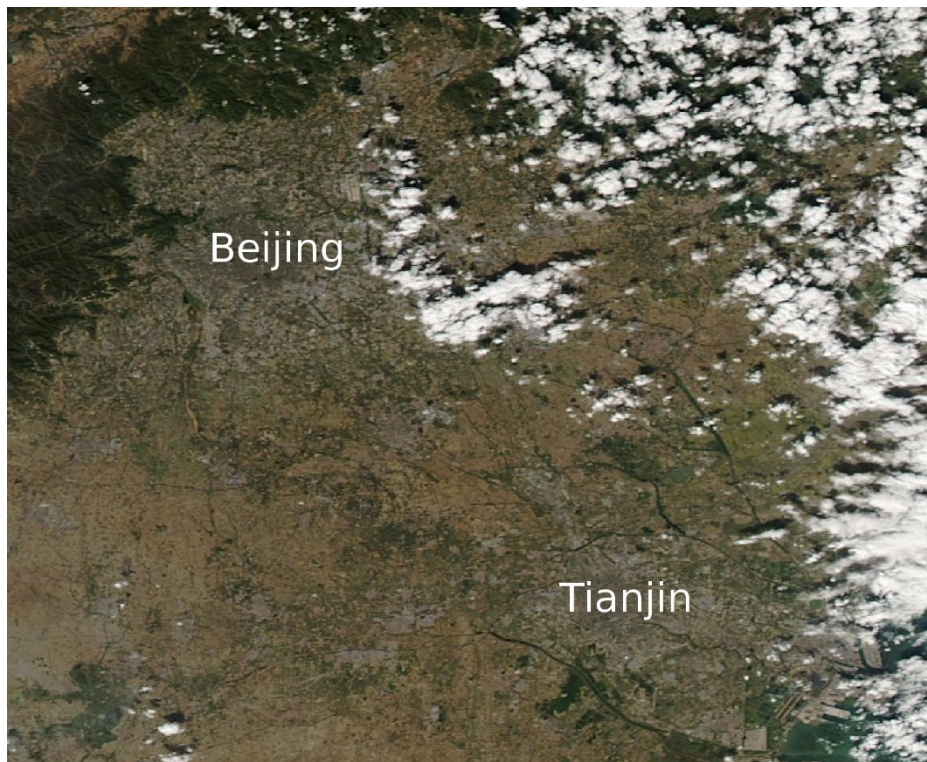




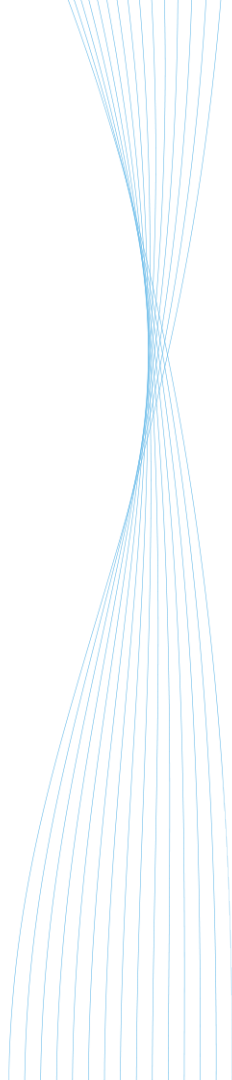
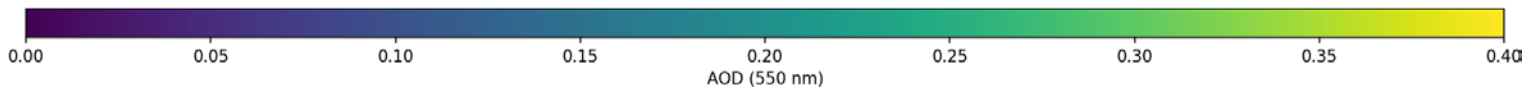
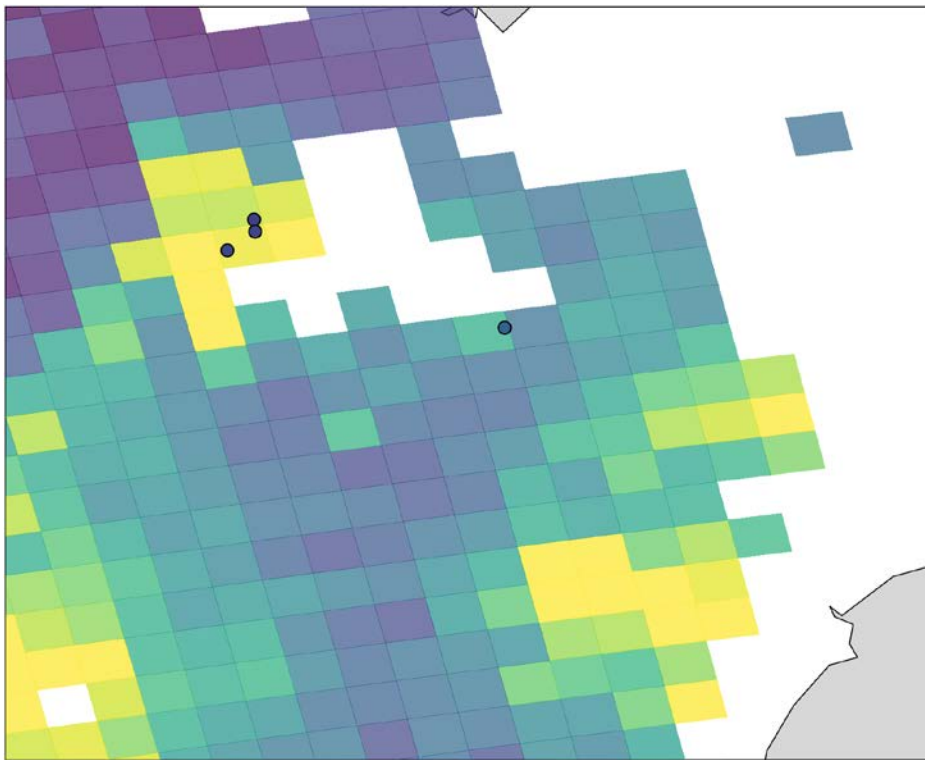
# MODIS Bayesian Dark Target Algorithm



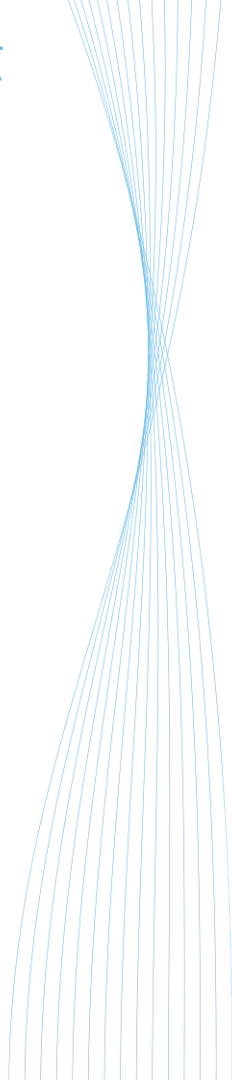
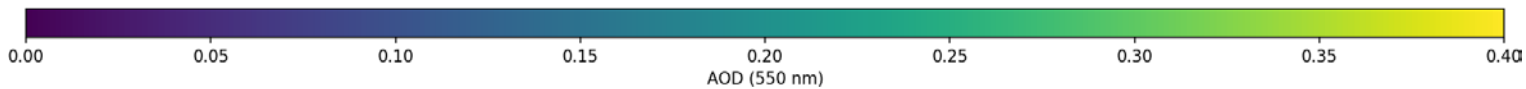
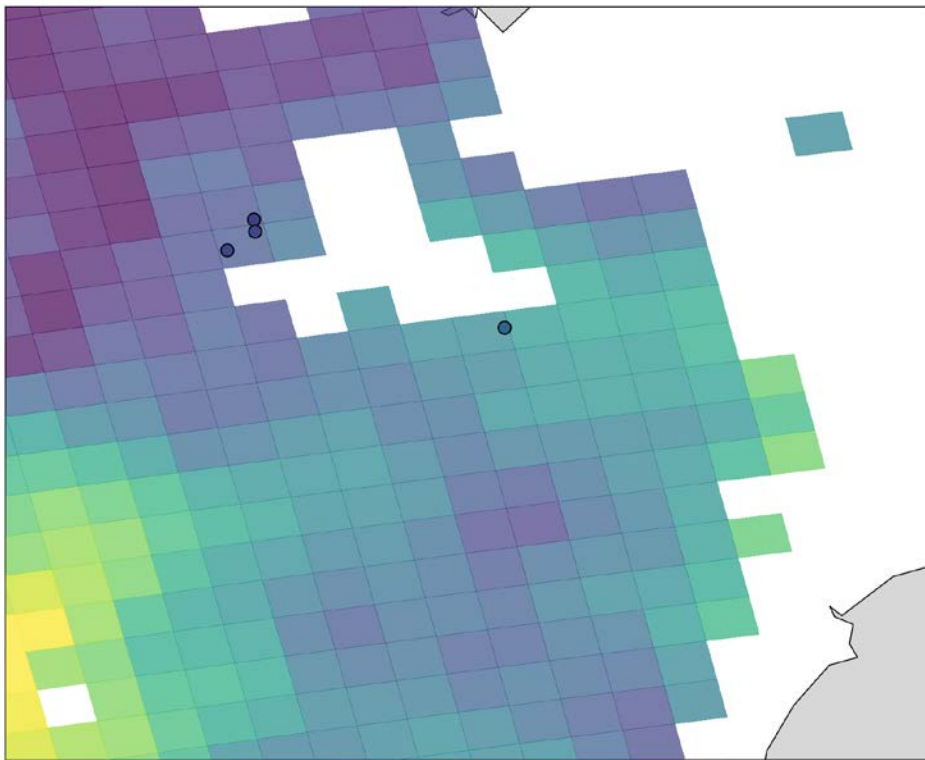
# MODIS corrected reflectance



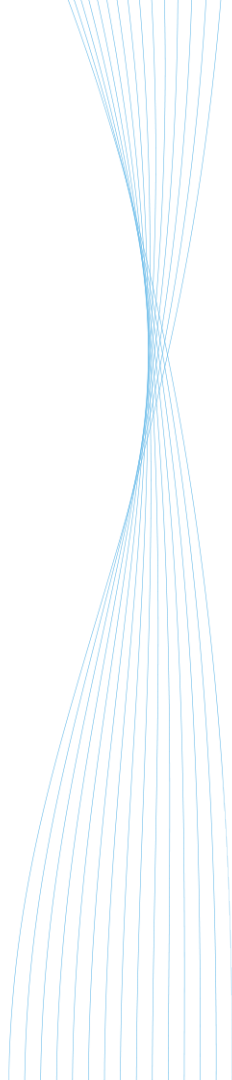
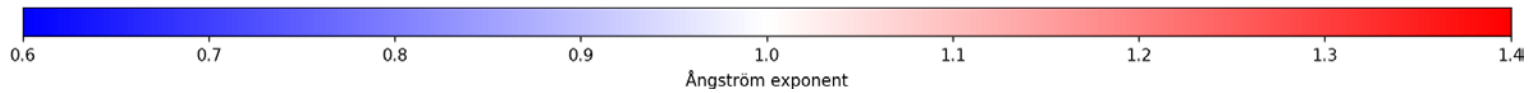
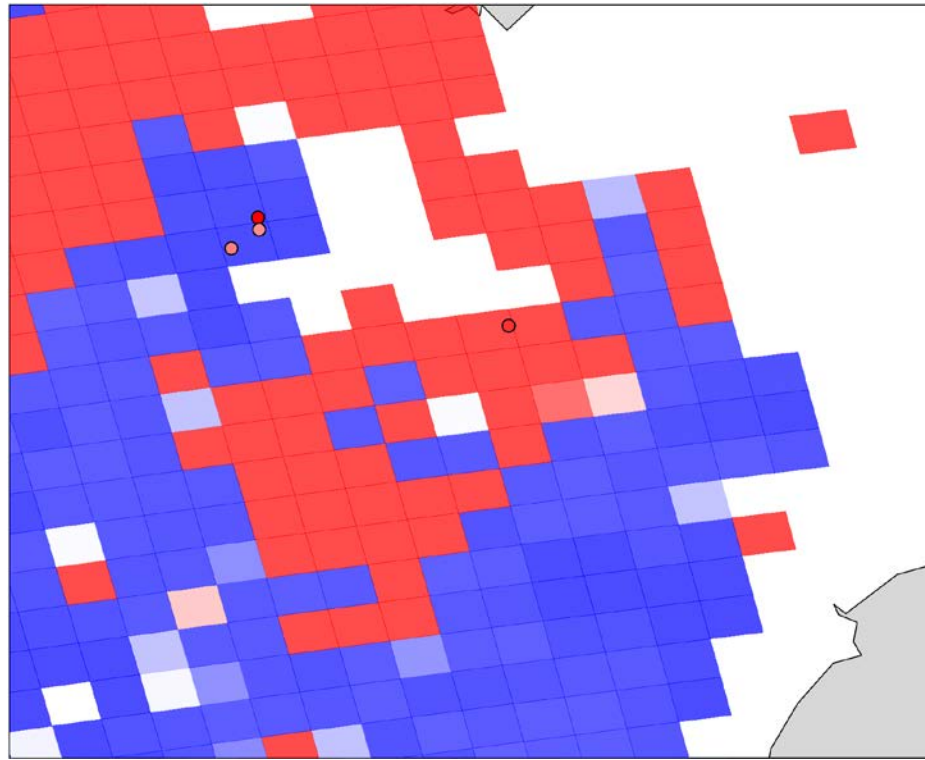
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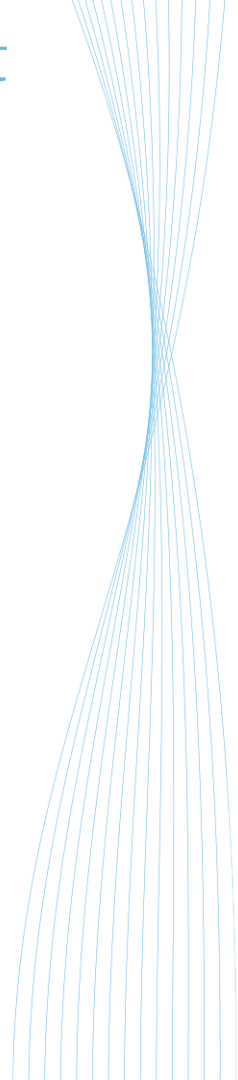
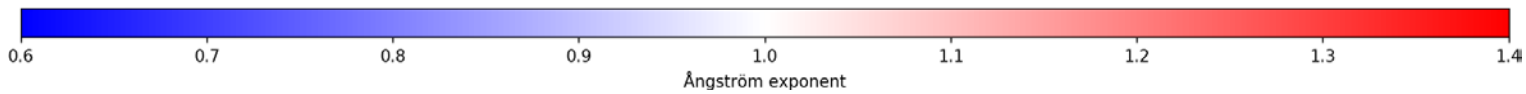
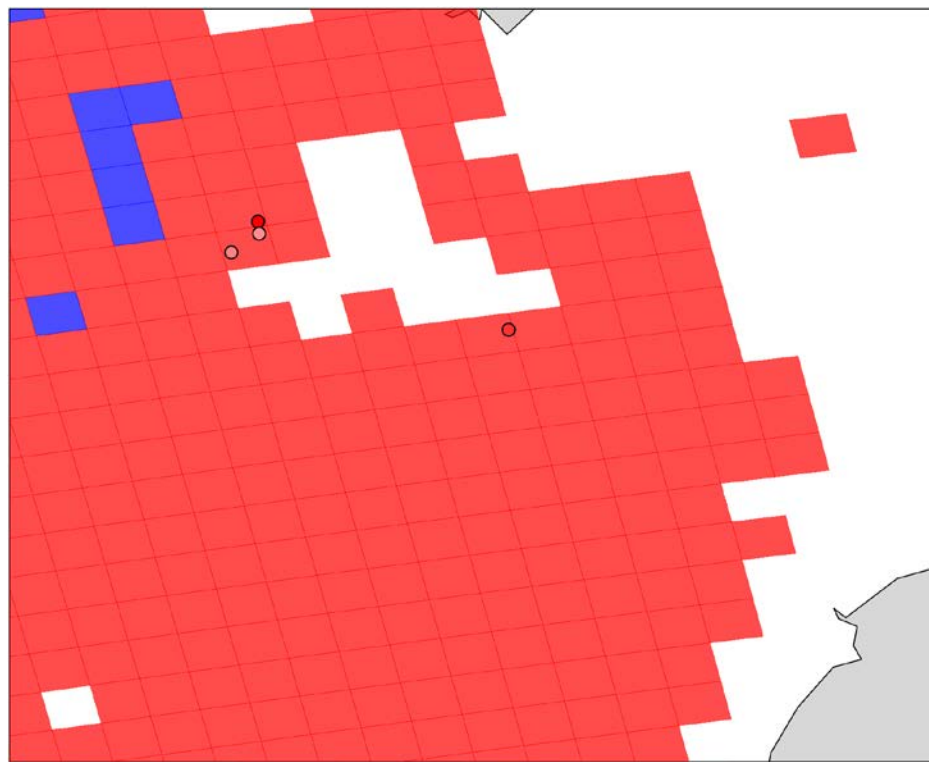
# MODIS Bayesian Dark Target Algorithm



# MODIS Dark Target Algorithm



# MODIS Bayesian Dark Target Algorithm





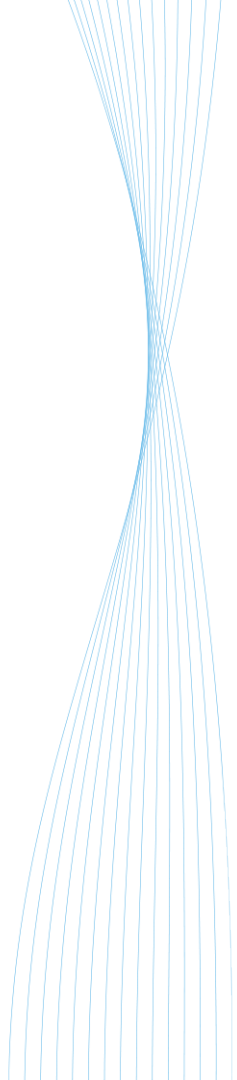
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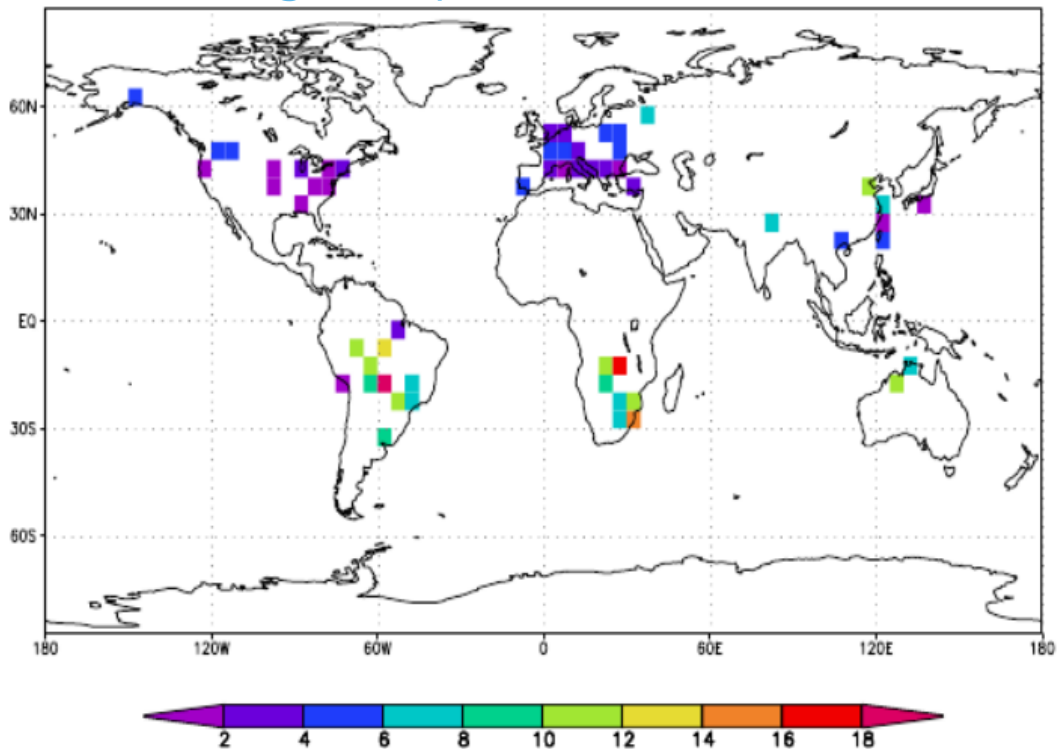
P-60 Antti Lipponen

Lipponen A., Mielonen T., Pitkänen M.R.A., Levy R.C., Sawyer V.R., Romakkaniemi S., Kolehmainen V. and Arola A., "Bayesian Dark Target algorithm for MODIS AOD retrieval over land" , *Atmos. Meas. Tech.*, submitted.

AERONET



# Retrieving aerosol composition from AERONET absorbing compounds



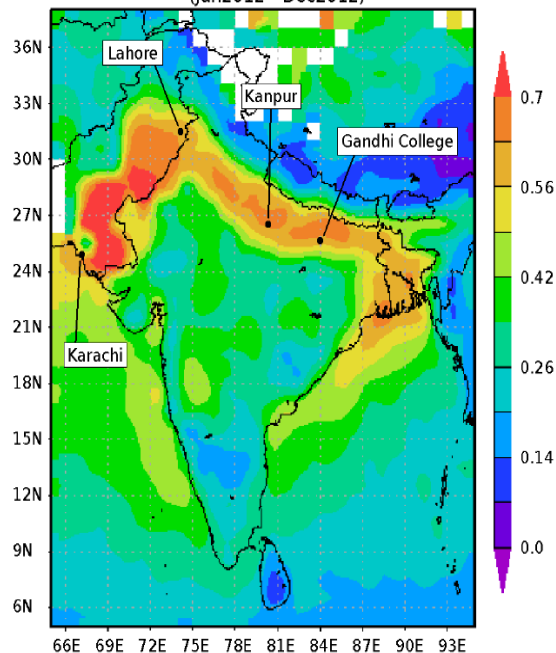
Schuster, G. L., O. Dubovik, B. N. Holben, and E. E. Clothiaux, Inferring black carbon content and specific absorption from Aerosol Robotic Network (AERONET) aerosol retrievals, *J. Geophys. Res.*, 110, D10S17, doi:10.1029/2004JD004548, 2005.

Arola, A., Schuster, G., Myhre, G., Kazadzis, S., Dey, S., and Tripathi, S. N.: Inferring absorbing organic carbon content from AERONET data, *Atmos. Chem. Phys.*, 11, 215-225, doi:10.5194/acp-11-215-2011, 2011.

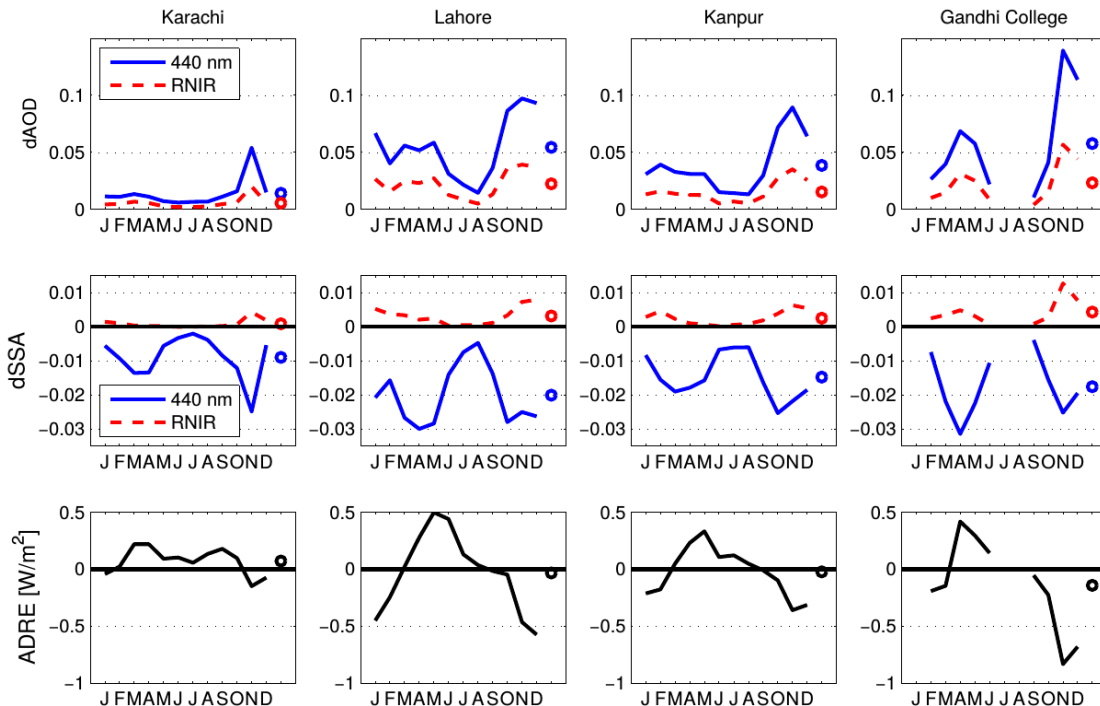
**Mean absorbing OC concentration (mg/m<sup>2</sup>)  
inferred from AERONET-retrieved imaginary  
indices for September.**

# Retrieving aerosol composition from AERONET absorbing compounds

MOD08\_M3.051 Aerosol Optical Depth at 550 nm [unitless]  
(Jan2012 - Dec2012)



**Figure 1.** Annual mean AOD from MODIS Terra, with our AERONET study sites overlaid in the map. Source of MODIS data: <http://disc.sci.gsfc.nasa.gov/giovanni>.



**Figure 5.** Upper panel: monthly averages of the difference in AOD at 440 nm (blue) and at RNIR (red) between simulations with and without BrC. Middle panel: corresponding cases for SSA. Lower panel: monthly average DRE of BrC. Corresponding annual averages are given by the symbol after December.

# Retrieving aerosol composition from AERONET absorbing compounds

Schuster, G. L., Dubovik, O., and Arola, A.: Remote sensing of soot carbon – Part 1: Distinguishing different absorbing aerosol species, *Atmos. Chem. Phys.*, 16, 1565-1585, <https://doi.org/10.5194/acp-16-1565-2016>, 2016.

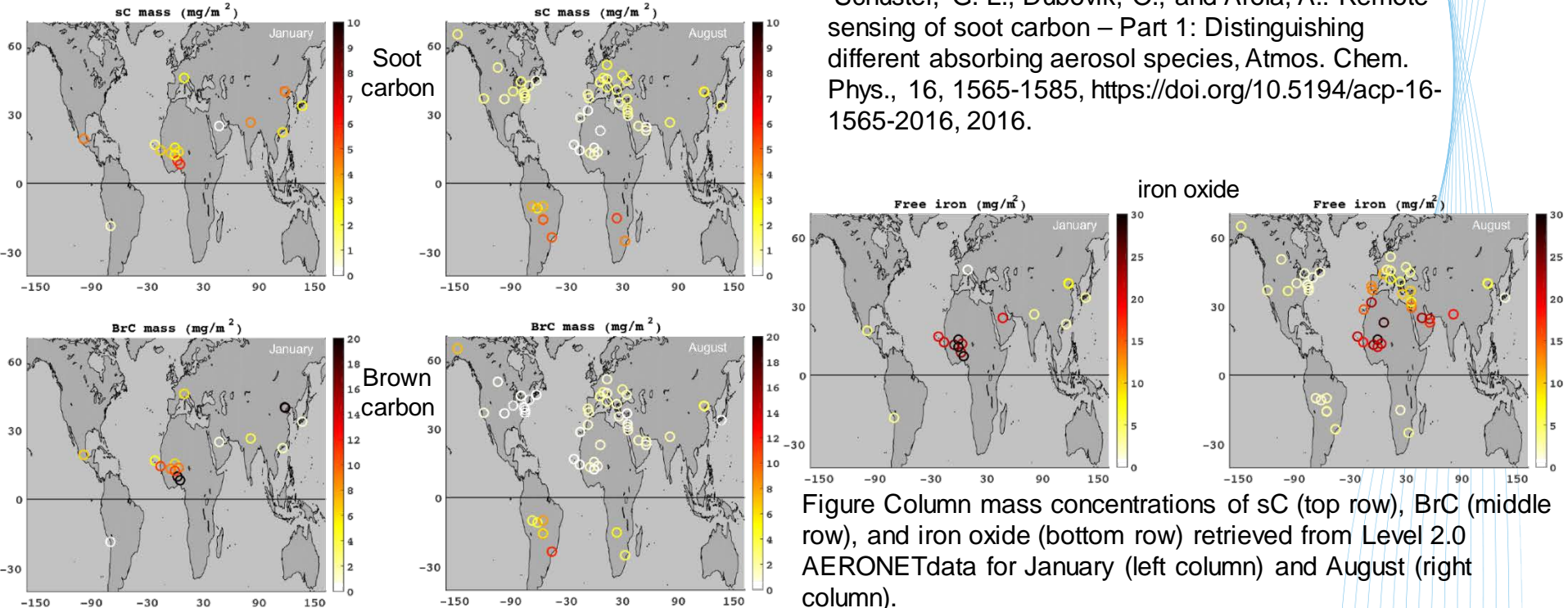


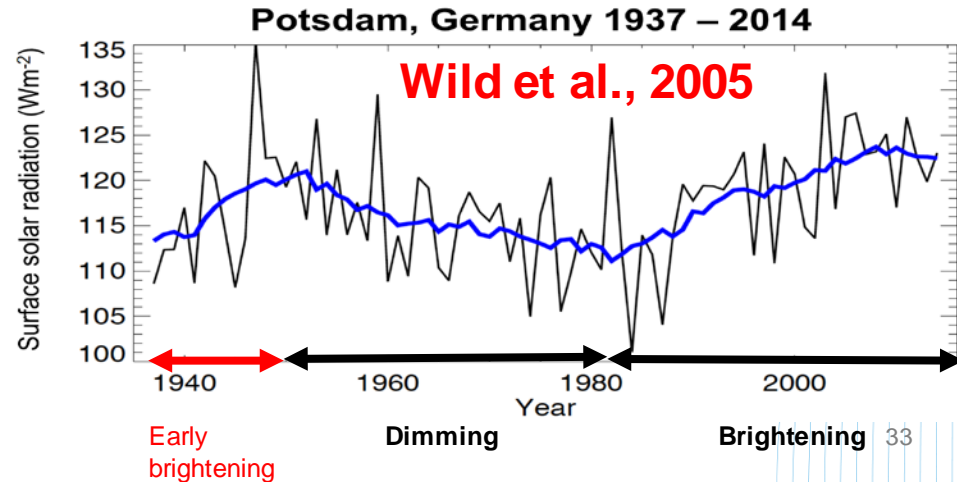
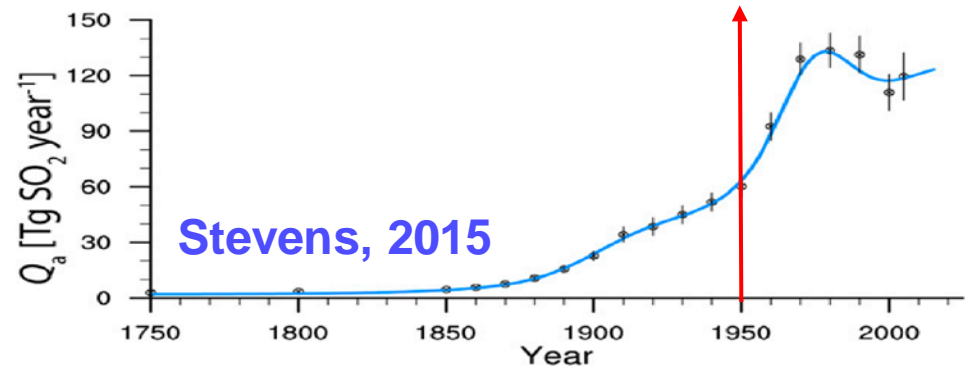
Figure Column mass concentrations of sC (top row), BrC (middle row), and iron oxide (bottom row) retrieved from Level 2.0 AERONET data for January (left column) and August (right column).

# New + old techniques



# Reconstructing the aerosol load in the past

- The present day anthropogenic aerosol forcing ranges between  $-0.1 \text{ W/m}^2$  and  $-1.9 \text{ W/m}^2$ , (IPCC, 2013)
- Stevens (2015) reduced the uncertainty over the Northern Hemisphere, it ranges between  $-0.3 \text{ W/m}^2$  and  $-1.0 \text{ W/m}^2$
- based solely on SO<sub>2</sub> emissions vs AOD comprises black carbon and organic aerosols
- constantly increasing of aerosol load before 1980 vs opposite findings of decreasing aerosol load before 1950



# Retrieving past AOD from SSR observations

- We applied different machine learning to retrieve AOD from SSR measurements, i.e. measurements not designed for AOD



Photo by: Andreas Christen, UBC  
<https://creativecommons.org/licenses/by/2.0/>



Aerocom 2017

# Retrieving AOD from SSR observations

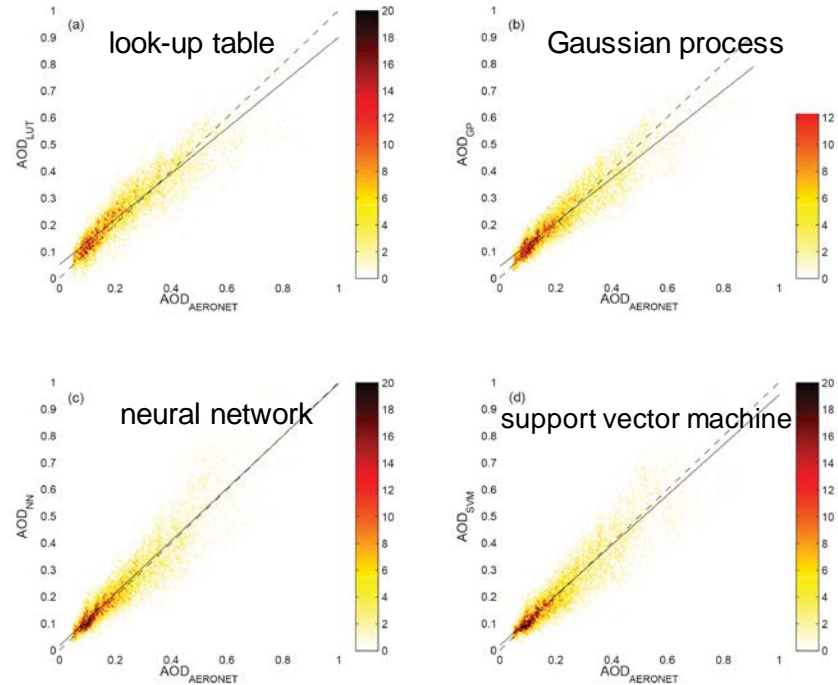
The retrieval was done using four ML methods:

- Gaussian process
- neural network
- random forest
- support vector machine.

We also included a

- look-up-table approach
- a non-linear regression method

for retrieving AOD from the same data (Huttunen et al., 2016). The methods were set up to reproduce the AOD observed by a sun photometer for each observed SSR, solar zenith angle (SZA), and water vapour content (WVC).



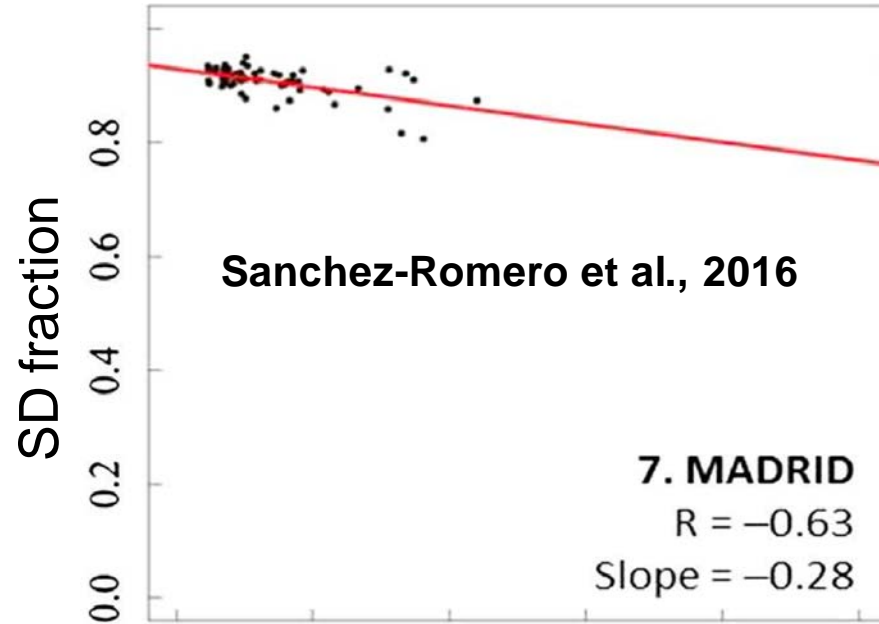
**Figure:** Observed (AERONET) vs predicted AOD:

# Going further back in time with sunshine duration (SD) measurements



Even back to 1800s?

Spain (2012-2014)



AERONET AOD at 440 nm



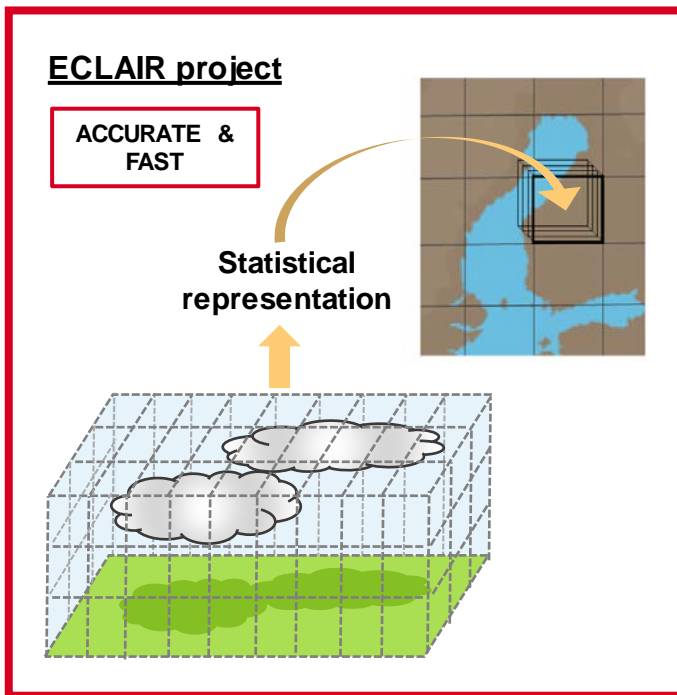
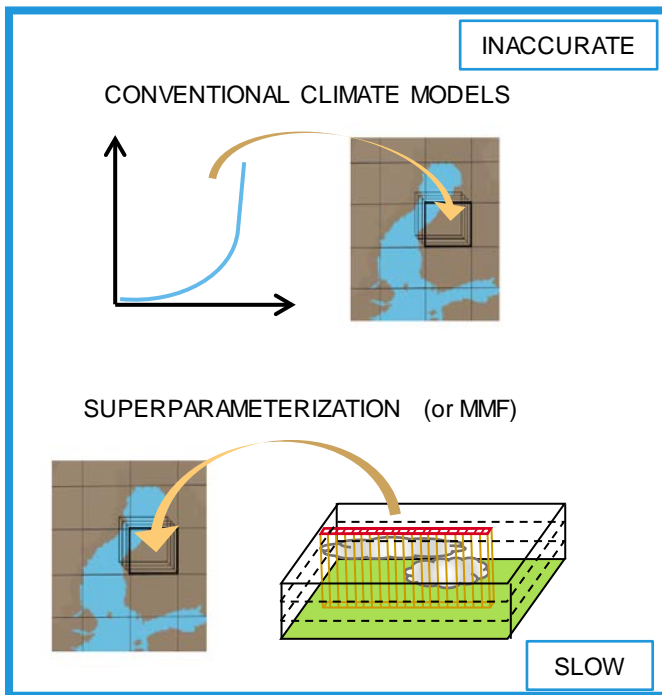
# Emulation of sub-grid scale aerosol-cloud interactions in climate models (ECLAIR)



ILMATIETEEN LAITOS  
METEOROLOGISKA INSTITUTET  
FINNISH METEOROLOGICAL INSTITUTE



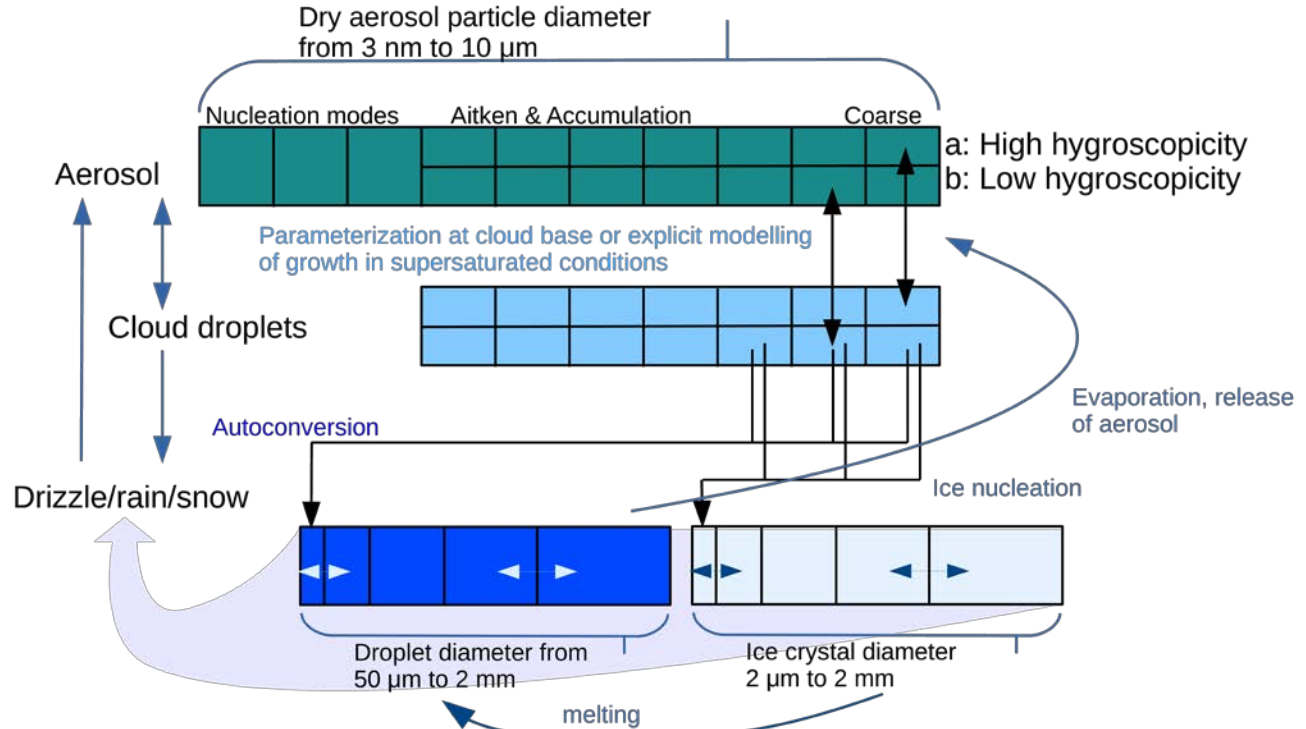
European  
Research  
Council



# Emulation of sub-grid scale aerosol-cloud interactions in climate models (ECLAIR)

UCLALES-SALSA

ECHAM-HAMMOZ

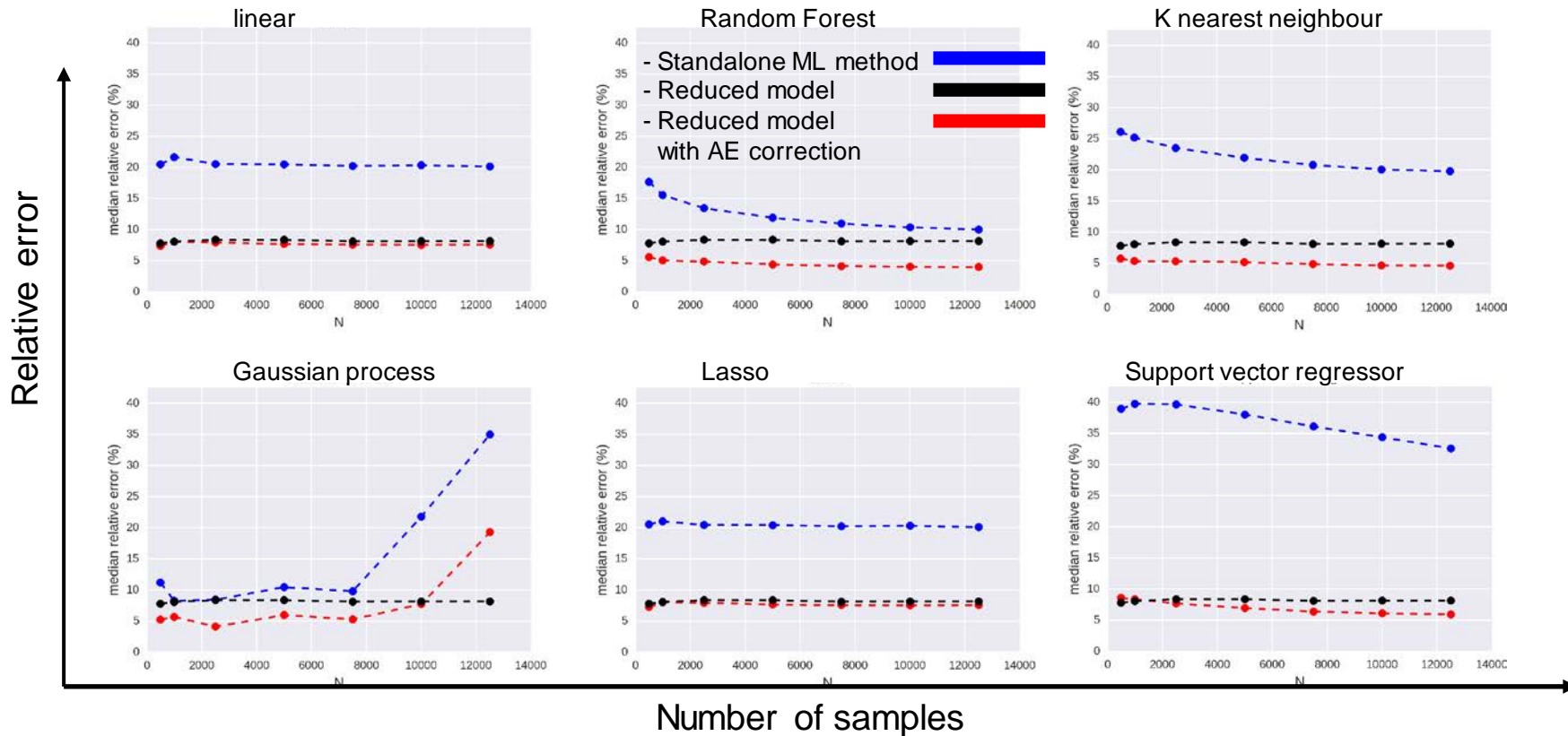






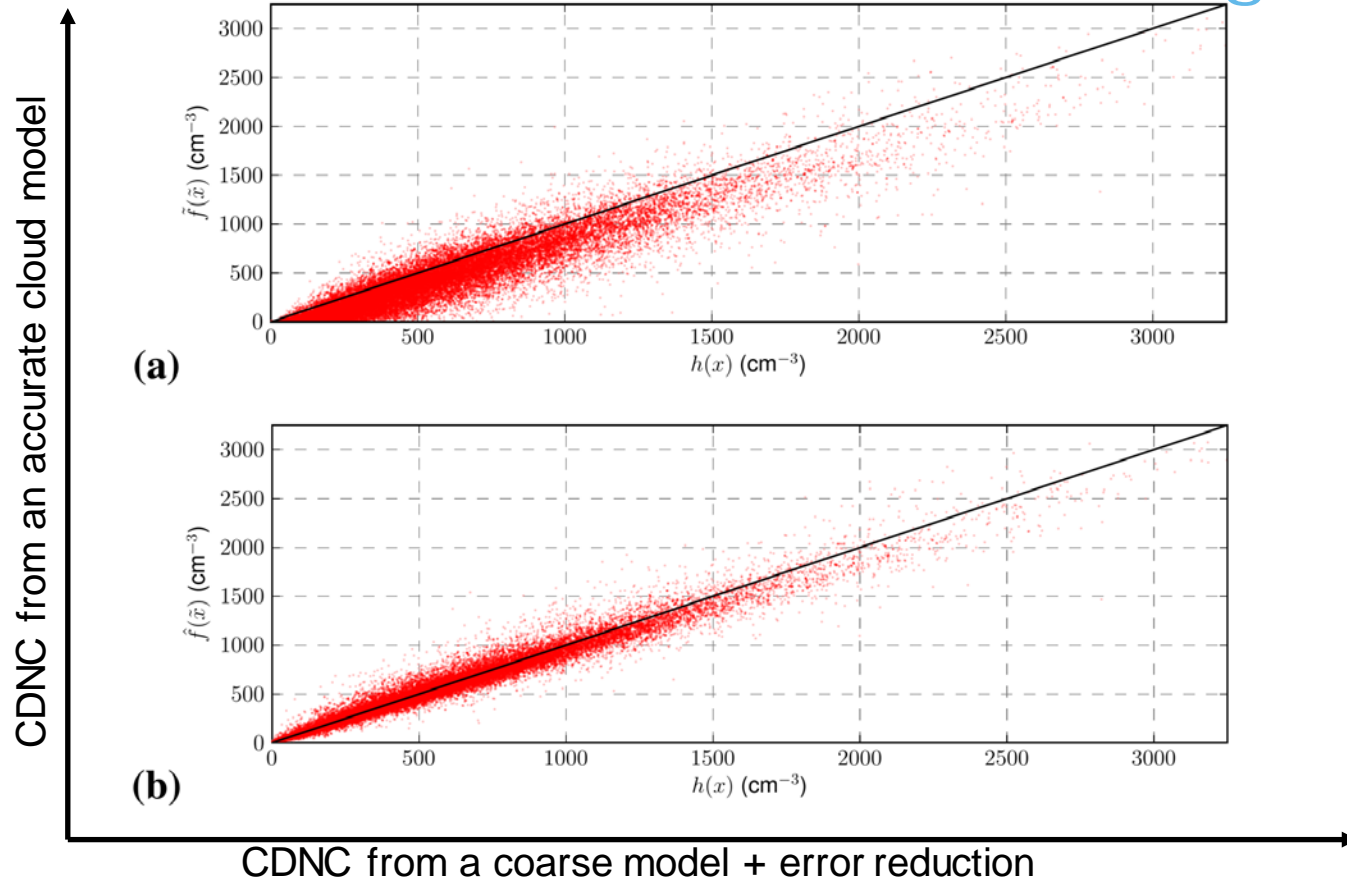
# Correction of model reduction error in simulations

Lipponen A., Huttunen J.M.J., Romakkaniemi S., Kokkola H., Kolehmainen V. (in preparation for SIAM J. Sci. Comput.)





# Correction of approximation errors with machine learning methods



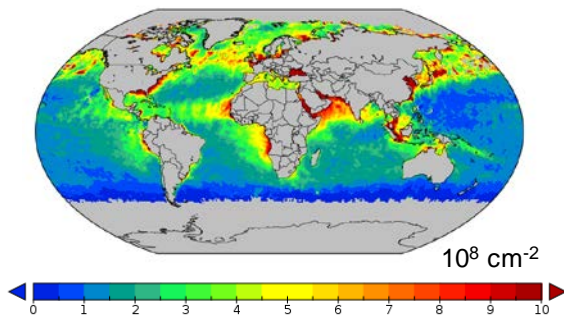


ILMATIETEEN LAITOS  
METEOROLOGISKA INSTITUTET  
FINNISH METEOROLOGICAL INSTITUTE

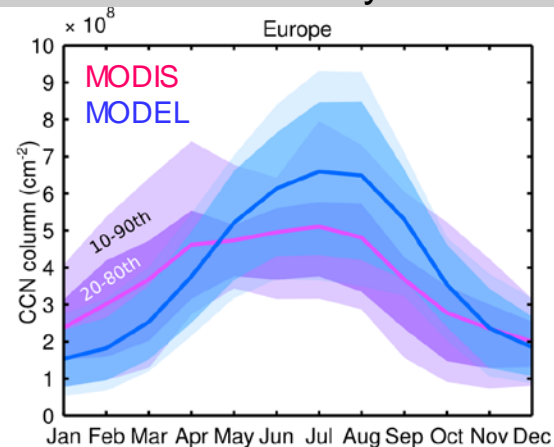
# Combining aerosol models + satellite data

# Evaluating simulated CCN concentrations from satellite observations

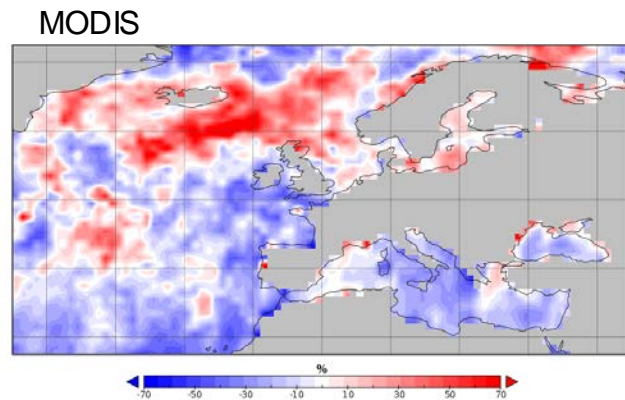
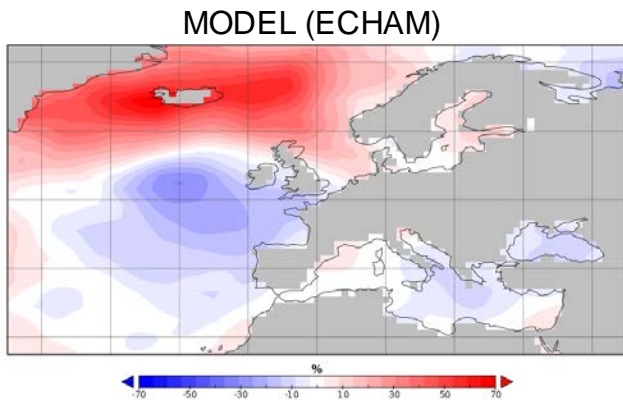
We utilize MODIS Terra, MOD08\_M3.051,  $1^\circ \times 1^\circ$ , PSML003\_Ocean, C6 column product (CCN/cm<sup>2</sup>) to evaluate changes in CCN over oceans.



## Seasonal cycle



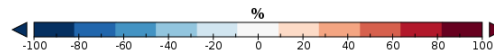
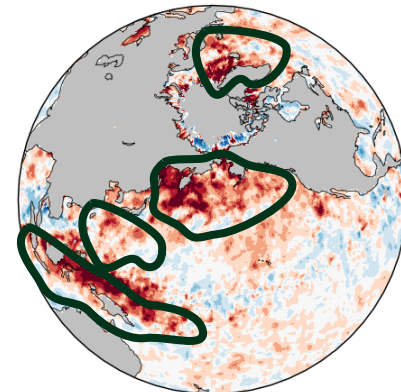
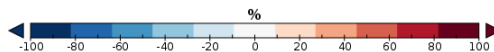
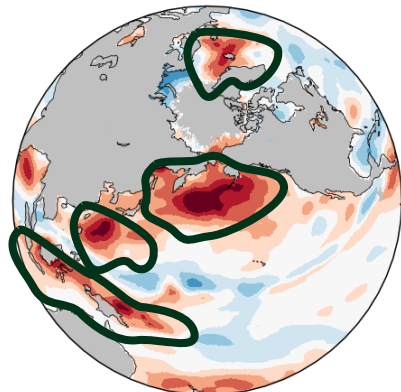
## Monthly anomaly for August 2004 (relative, %)



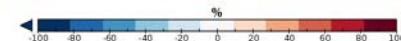
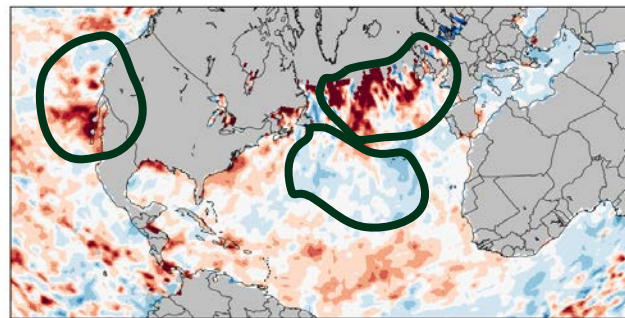
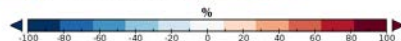
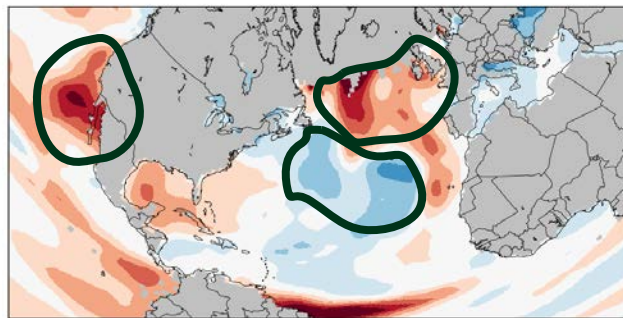
# Examples of monthly CCN anomalies

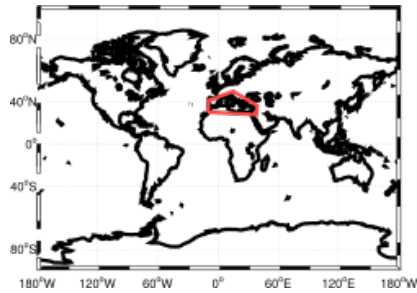
Pacific  
September 2002

Control-simulation

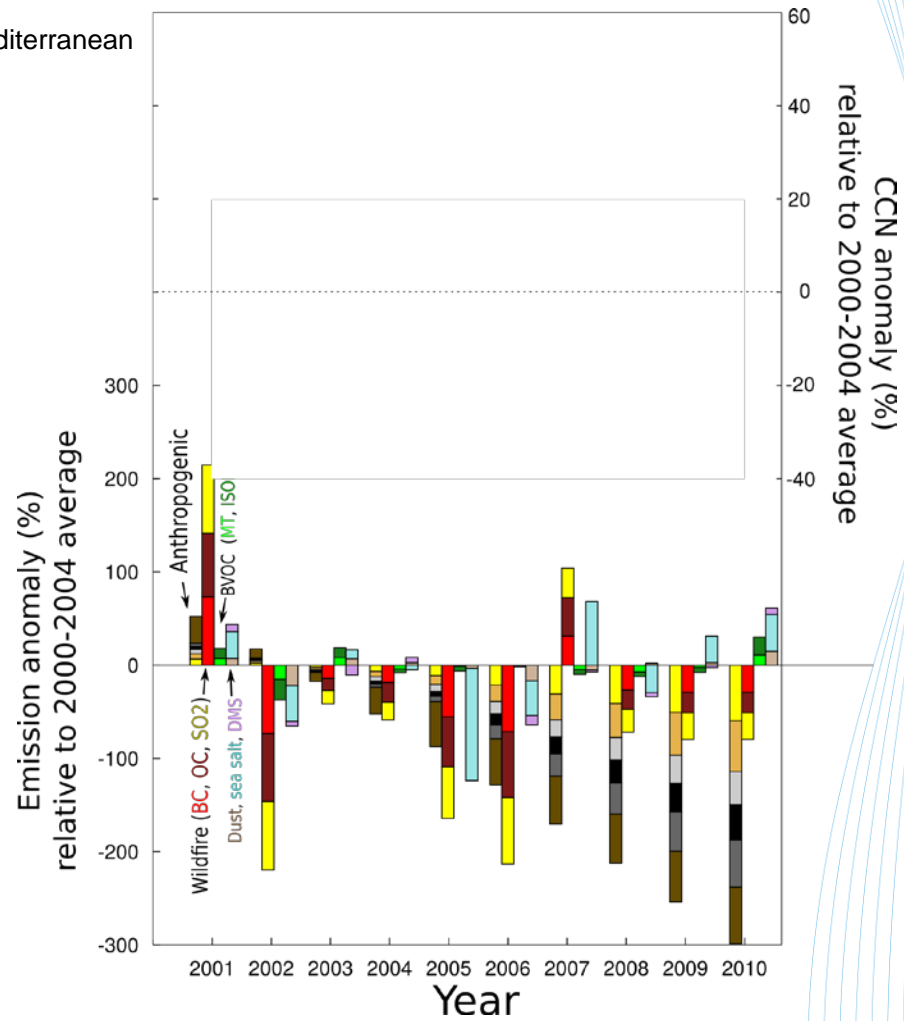


Atlantic  
November 2007

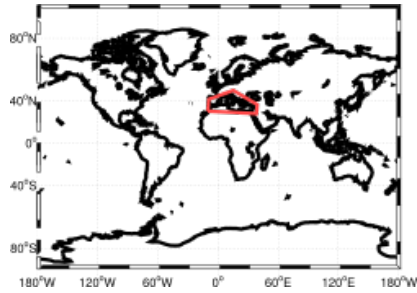




Mediterranean

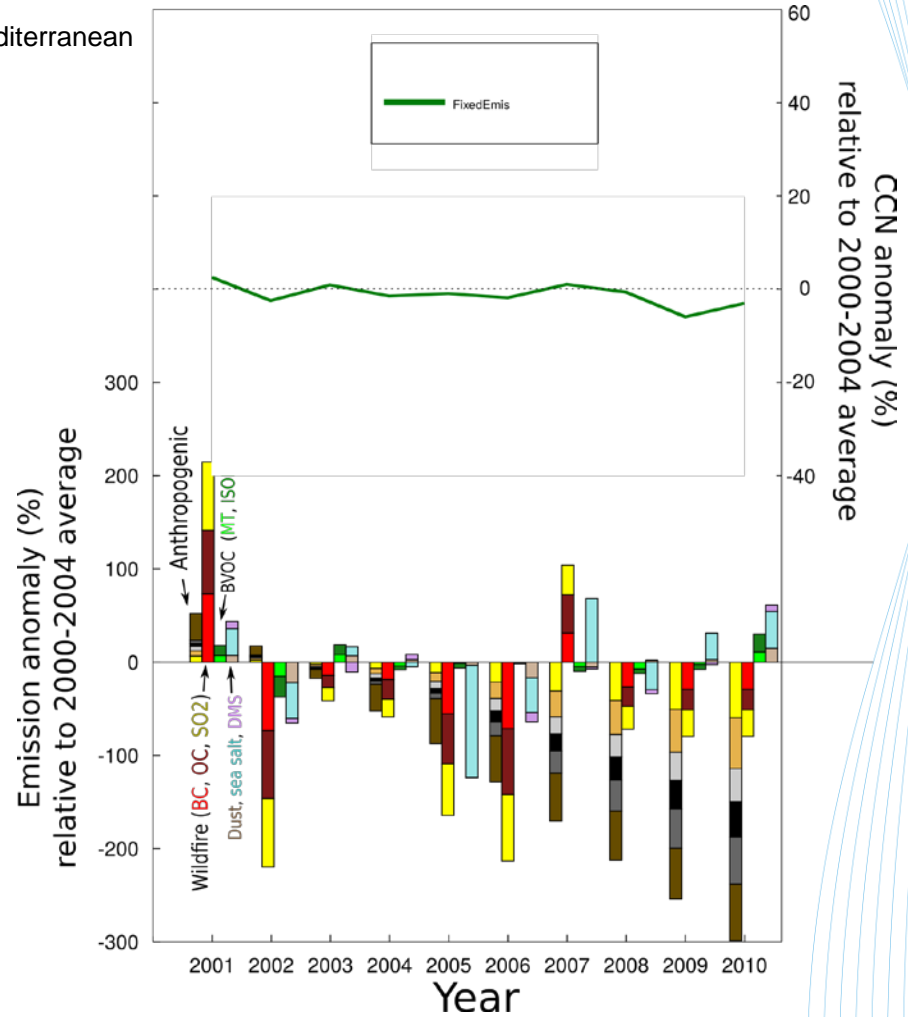


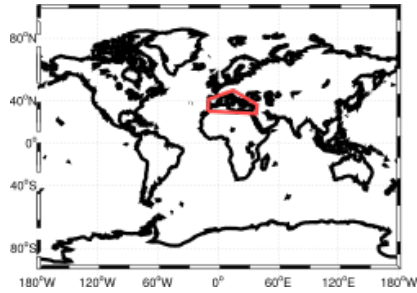




Mediterranean

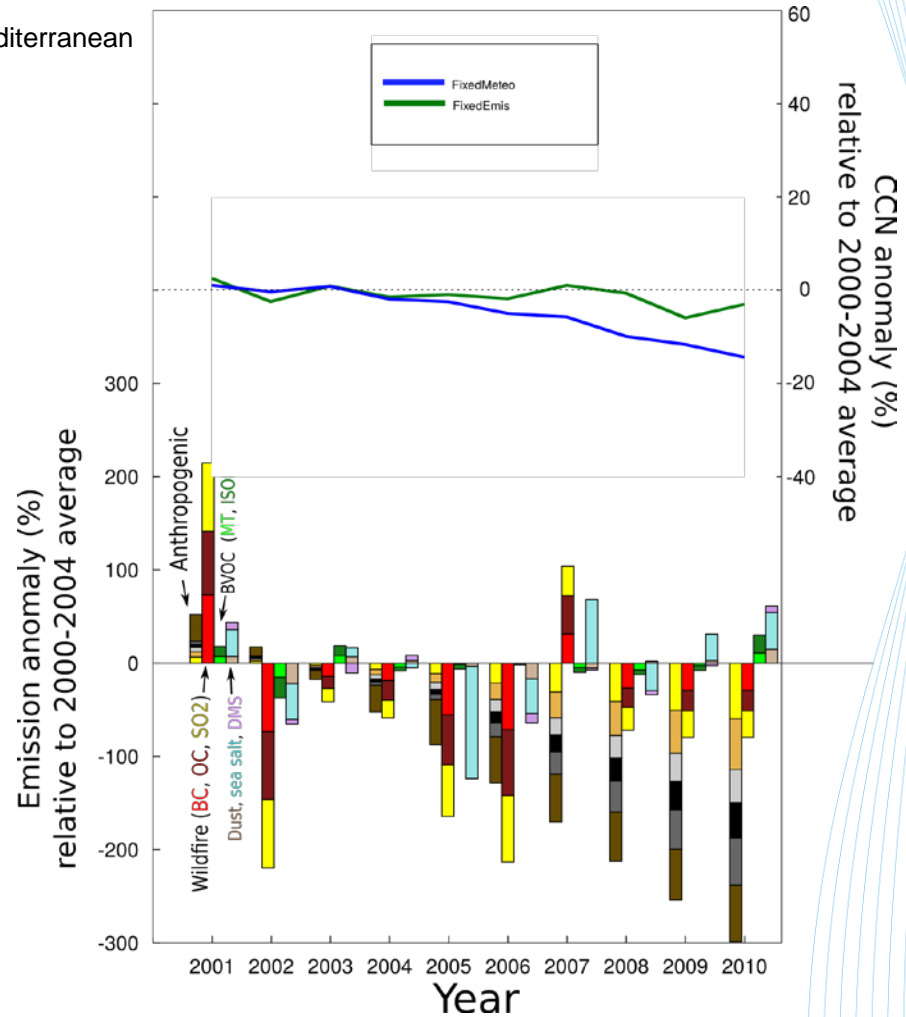
- 1) FixedEmis indicates  $<\pm 5\%$  of natural variability in CCN concentration

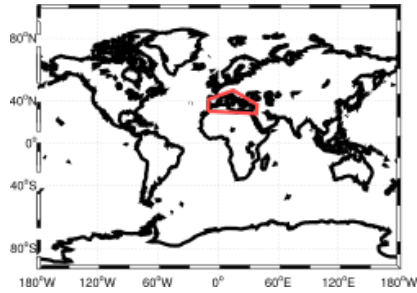




Mediterranean

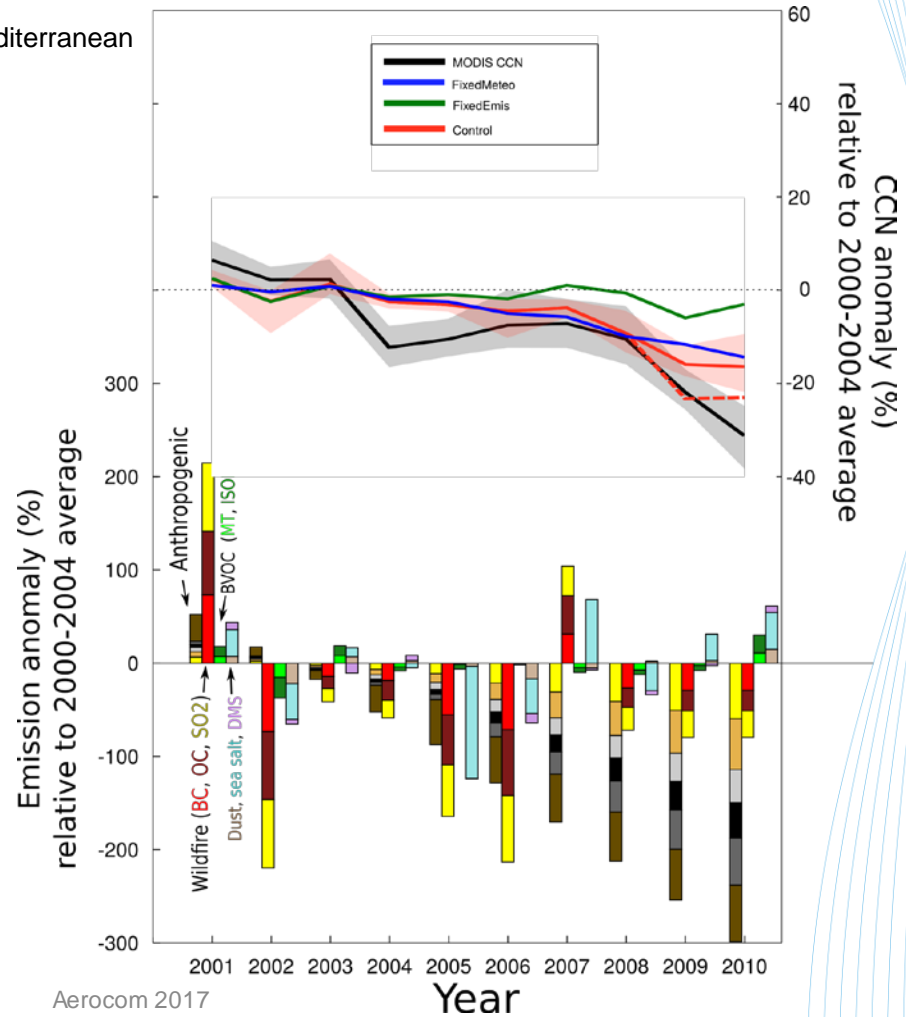
- 1) FixedEmis indicates  $<\pm 5\%$  of natural variability in CCN concentration
- 2) FixedMeteo shows rather steady decrease during the whole period



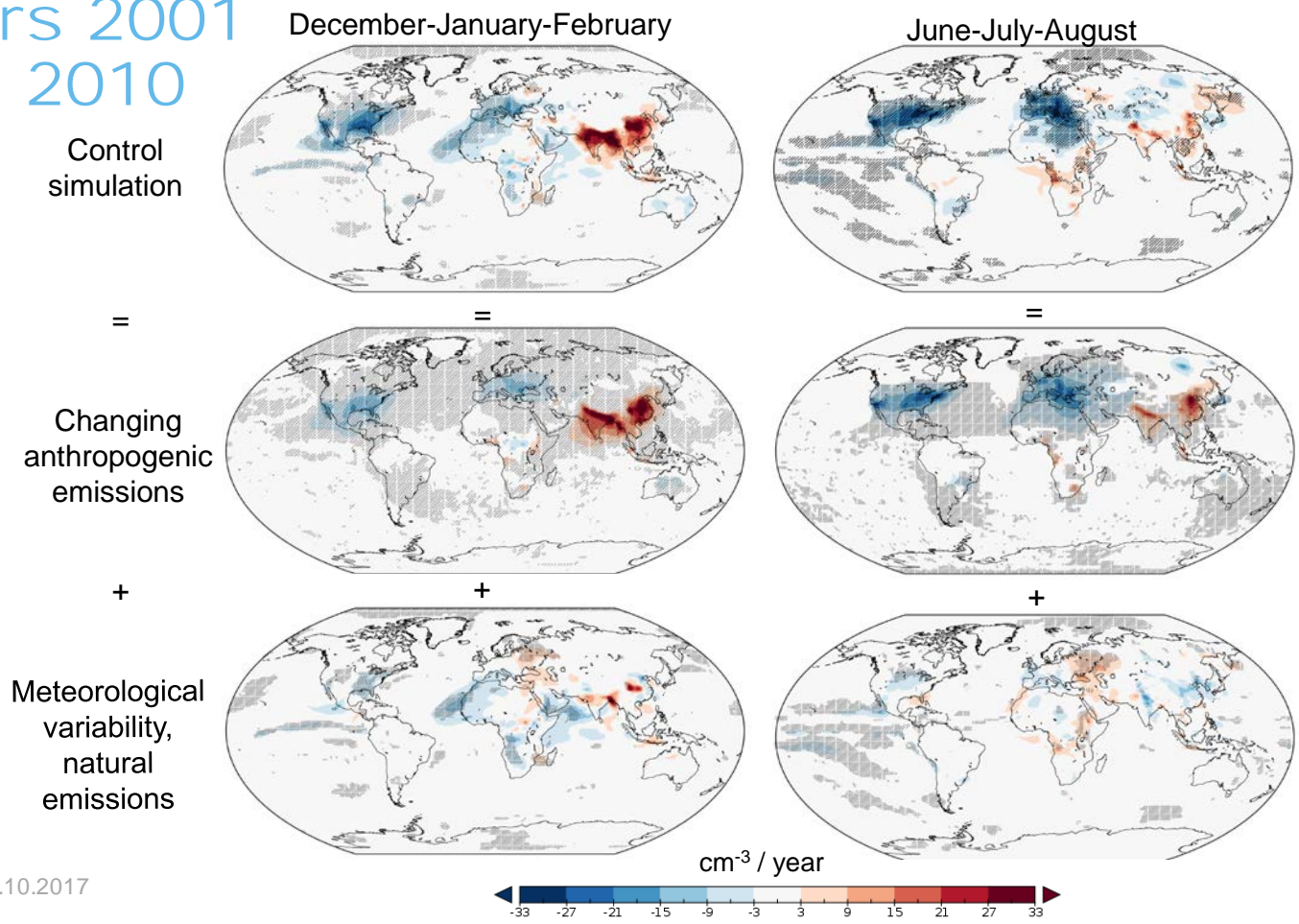


Mediterranean

- 1) FixedEmis indicates  $<\pm 5\%$  of natural variability in CCN concentration
- 2) FixedMeteo shows rather steady decrease during the whole period
- 3) Control simulation follows the anthropogenic emission anomalies

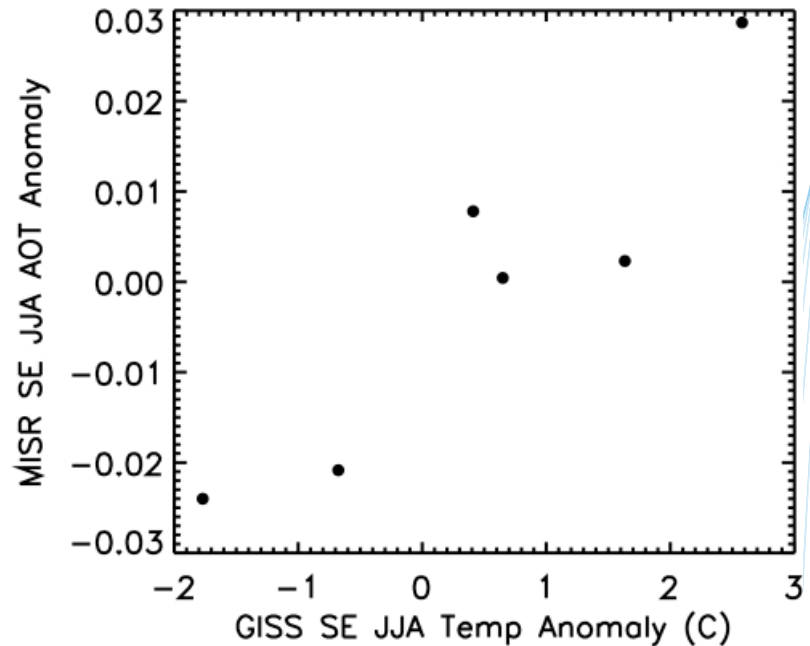
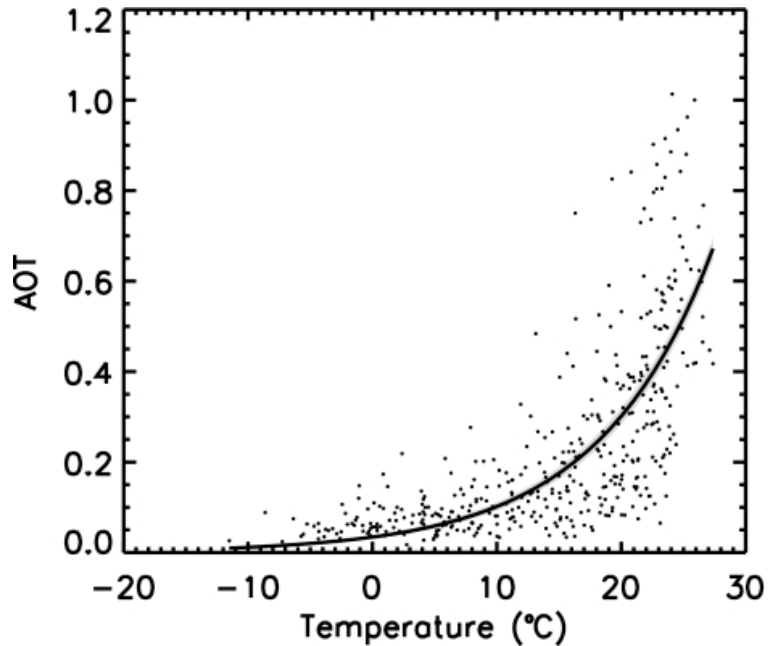


# Simulated global trends of CCN(0.2%) between years 2001 and 2010

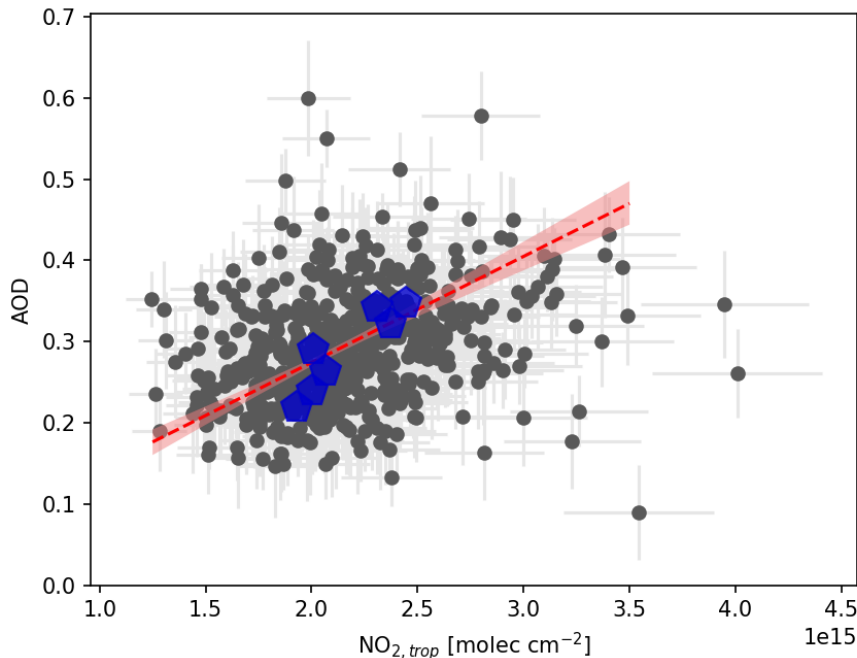


P-43 Risto Makkonen

# Temperature dependence of biogenic AOD



# Temperature dependence of biogenic AOD



Tropospheric NO<sub>2</sub> assumed to be a proxy for anthropogenic AOD

Remaining temperature dependent AOD of biogenic origin

- anthropogenic contribution was estimated with a linear fit between the summertime AOD and tropospheric NO<sub>2</sub> columns ( $AOD=1.31e^{-16}NO_{2,trop}+0.013$ )

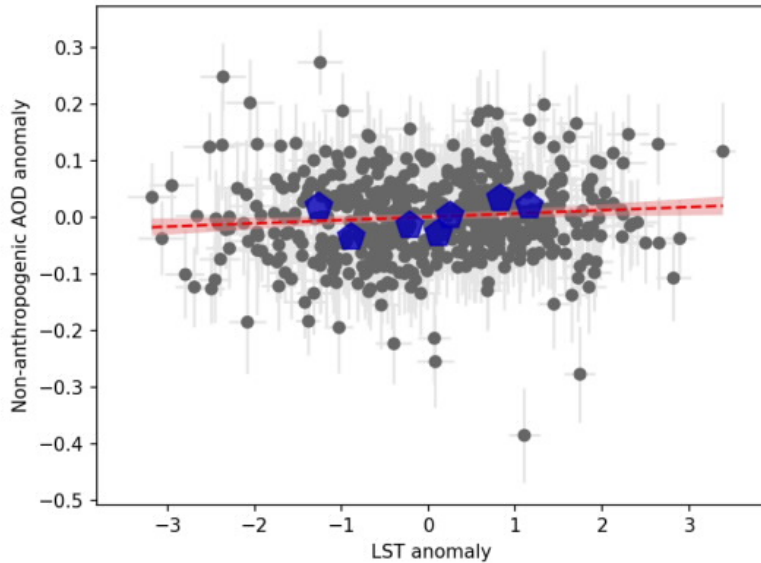


# Temperature dependence of biogenic AOD

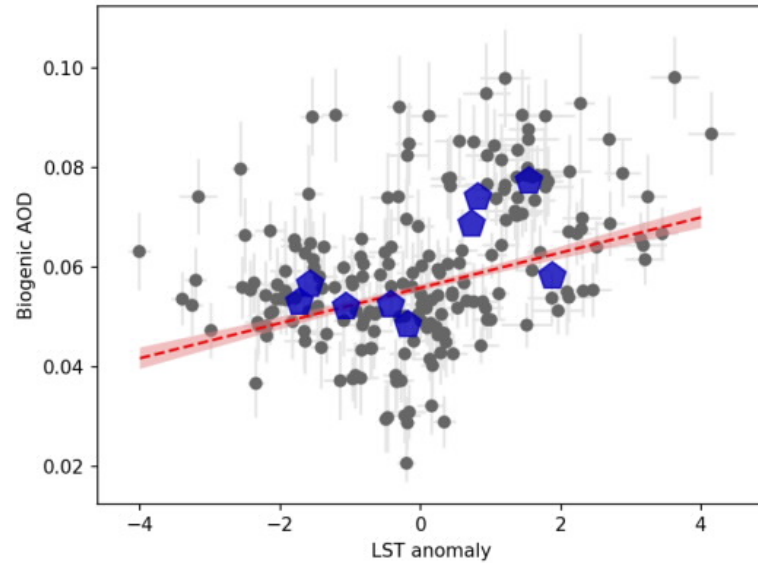
Remaining temperature dependence of biogenic origin?

Residual AOD after NO<sub>2</sub> dependence subtracted

Satellite



ECHAM-HAMMOZ



Talk in Session 10: Tero Mielonen

# Conclusions

- Nucleation is necessary in models
- Global aerosol models and satellite data can be useful
  - Know their uncertainties and limits
  - Use the to complement each other