

# deriving a best guess of aerosol direct radiative forcing

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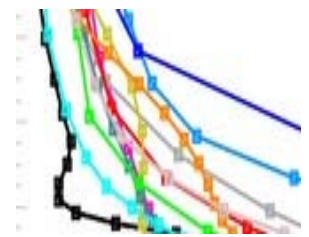
*acknowledgements*

Jan Griesfeller, AeroCom modellers, Stefan Kinne, AERONET,  
Paul Eckhardt and EBAS/EMEP data structure



# Motivation

## goals / steps / outline



Explore use of observations to reduce model uncertainty in direct radiative forcing

( thus emphasis on models with direct radiative forcing estimate in AeroCom)

Compare multi-model ensemble to multi-parameter observational dataset

Compare phase I and II model submissions

Use year of simulation and climatology of obs data to check robustness of quality

Document quality of models

Find regional AAOD and AOD correction factors

Find regional species-AOD correction factors with multivariate statistics

Adjust regional and species AOD and use forcing efficiency for new forcing estimate

Check if variability in AOD and forcing is reduced

Discuss BC diverse observational constraints specifically

Discuss value of model ensemble AeroCom Median A, B, A2

Discuss anthropogenic fraction uncertainty

Test if weighting models by quality would yield a similar results

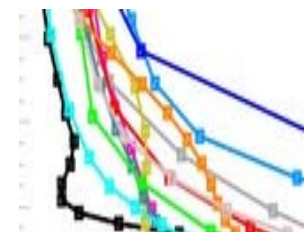
Comparison to other forcing estimates

Evaluation against satellite products?



# State of Model evaluation analysis

## AeroCom B and A2



AeroCom B y2000

AeroCom Phase II y2006

AEROCOM\_MEDIAN (expA)

GISS\_B

=> RF

GISS-modelE.A2.CTRL

RF

*GISS-Matrix*

RF

*UIO\_GCM (clim)*

=> RF

CAM4-Oslo-Vcmip5.A2.CTRL (clim)

RF

CAM5-MAM3-PNNL.A2.CTRL

RF

LOA\_B

≠ RF

HadGEM2-ES.A2.CTRL

*HadGEM2-ES.A2.CTRL-DIRECT*

RF

LSCE\_B

(=>) RF

*LSCE.A2.CTRL*

RF?

MATCH\_B

BCC\_AGCM2.0.1\_CAM.A2.CTRL

RF

GMI.A2.CTRL

RF

GOCART-v4Ed.A2.CTRL

RF?

MOZGN\_B

(=>)

*GFDL*

RF?

MPI\_HAM

=> RF

MPIHAM\_V2\_KZ.A2.CTRL

MPIHAM\_V2\_KZ.A2.CTRL-DIRECT

RF

UIO\_CTM\_B

=> RF

OsloCTM2.A2.CTRL

RF

UMI\_B

RF

*IMPACT*

KYU\_B

=> RF

SPRINTARS-v384.A2.CTRL

RF

TM5\_B

TM5-V3.A2.CTRL

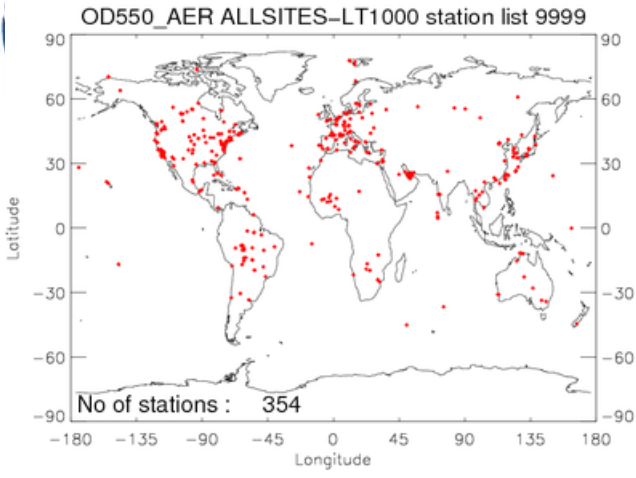
*ULAQ\_B*

RF

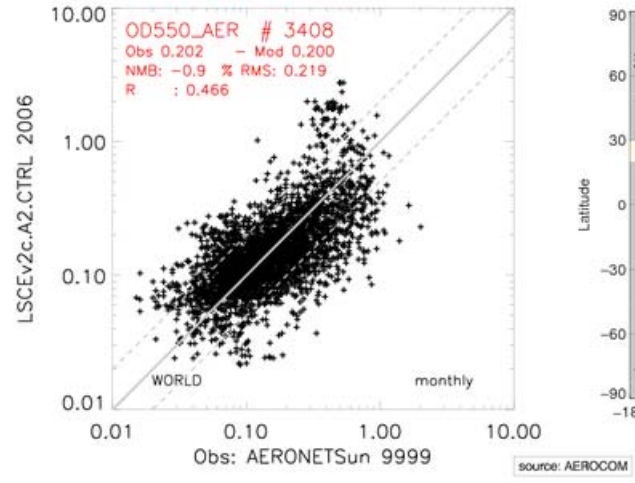
*MODEL NOT ANALYSED YET, missing or error on my side*



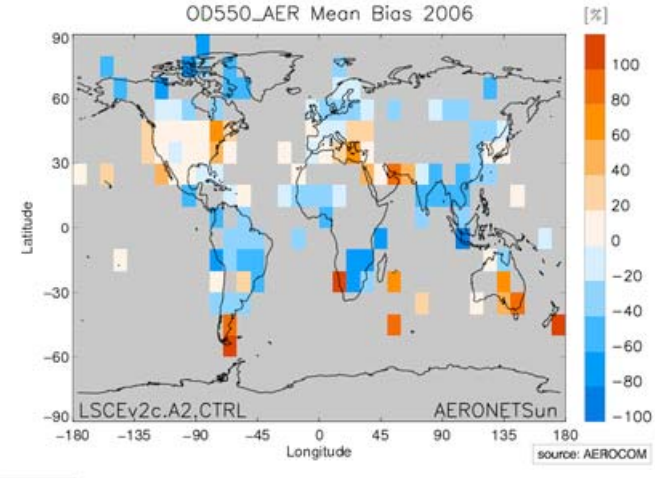
# Where compared ?



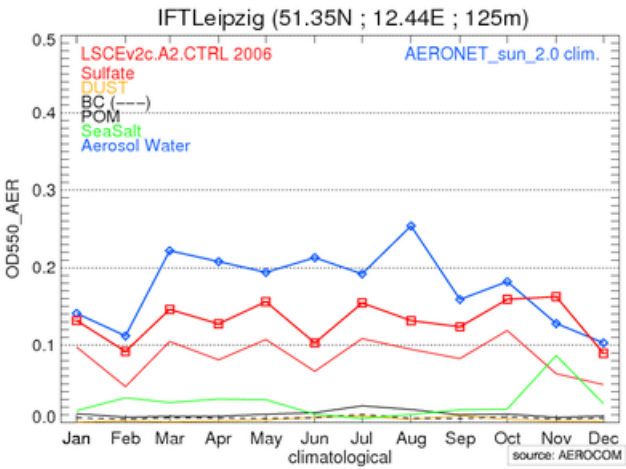
# Correlated ?



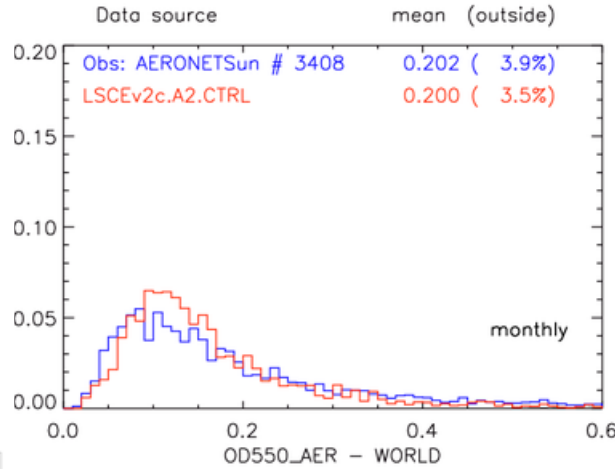
# Regional Normalized Bias ?



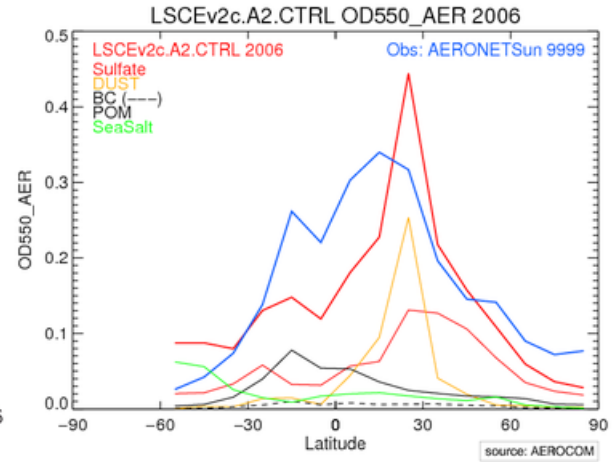
# Local month to month variation?



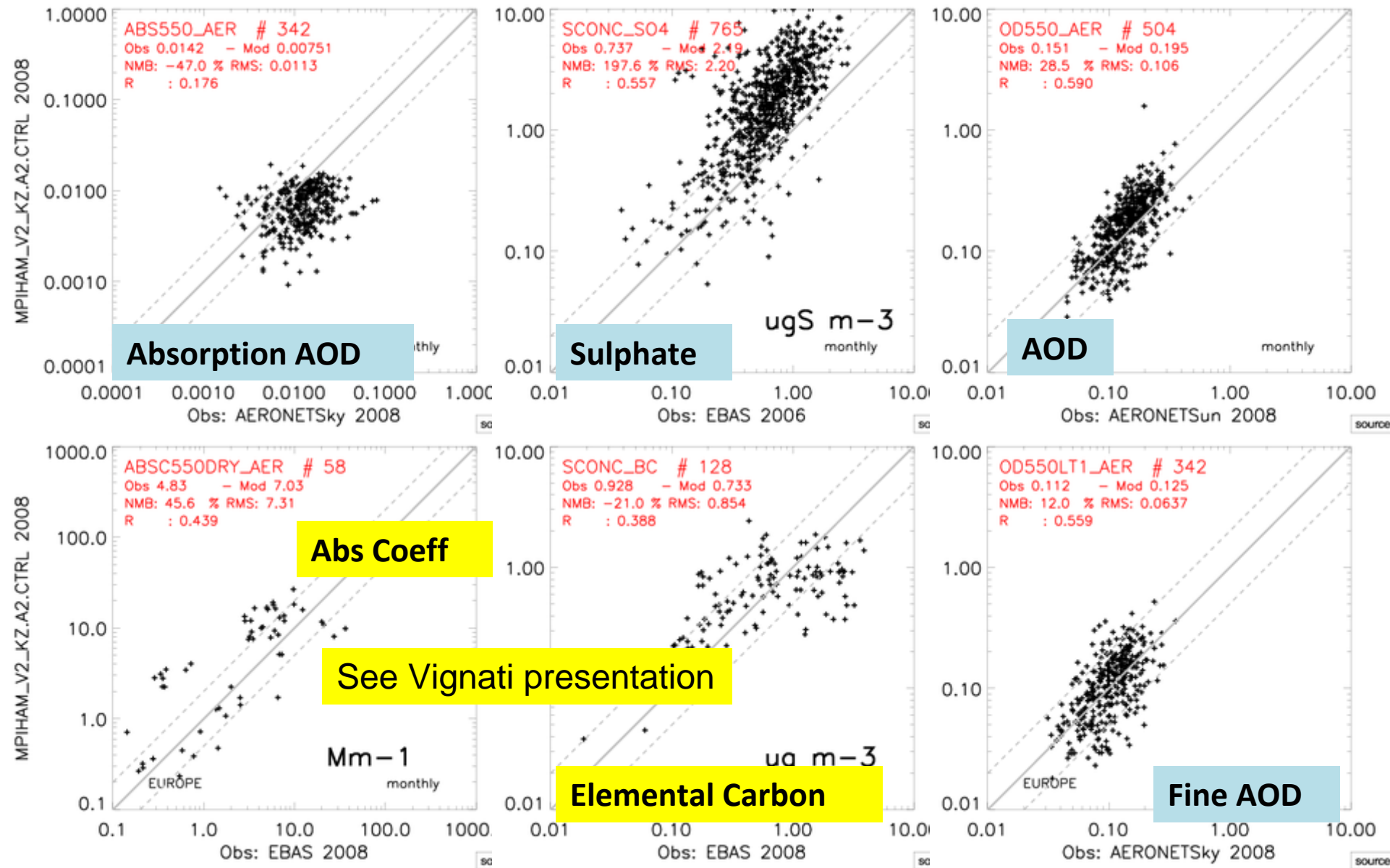
# Histogram?



# Zonal Absolute Bias ?



**AeroCom phase II standard visualization against observational data**  
**Example LSCE.A2.CTRL / Aeronet Aerosol Optical Depth, year 2006**



**Evaluation against multiple observational datasets**  
**Example ECHAM5-HAM.A2.CTRL**





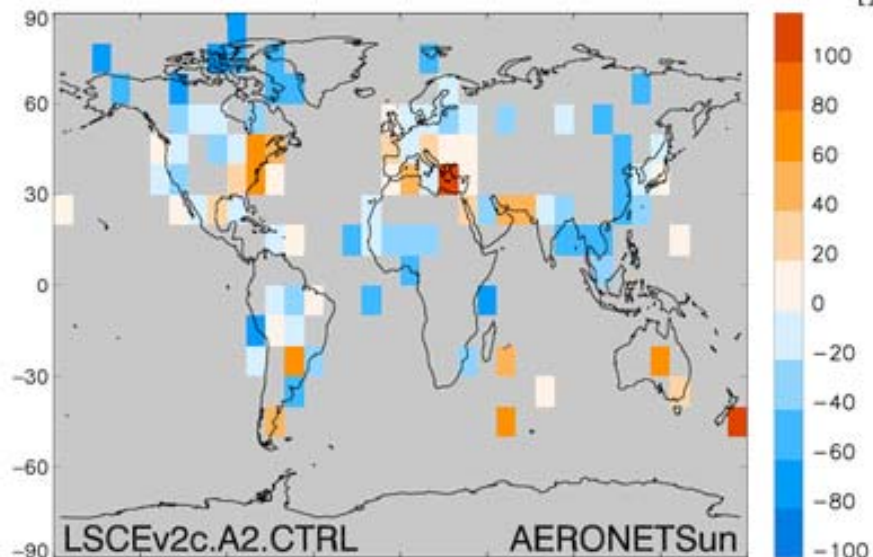
# BIAS in Aerosol Optical Depth

## EXAMPLE 4 models – year 2008 Aeronet “sun” data



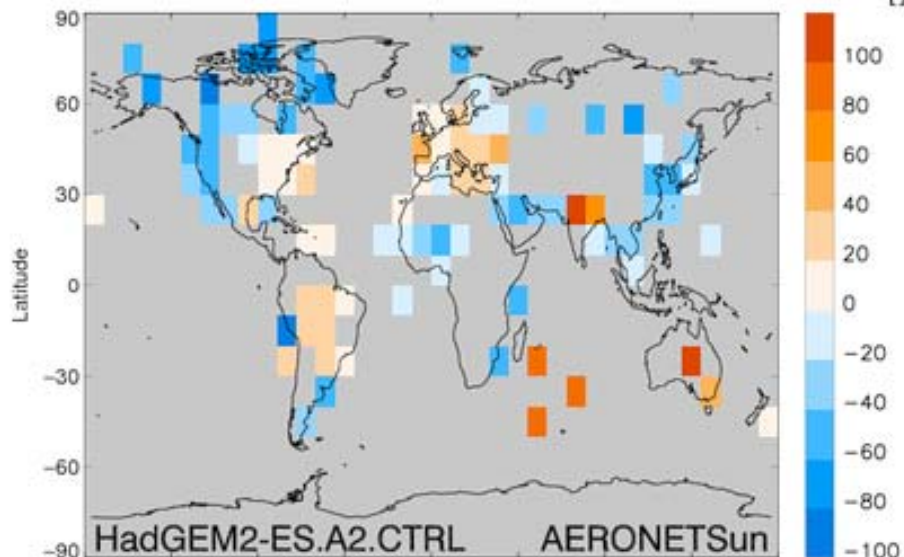
OD550\_AER Mean Bias M:2006 O:2008

[ ]



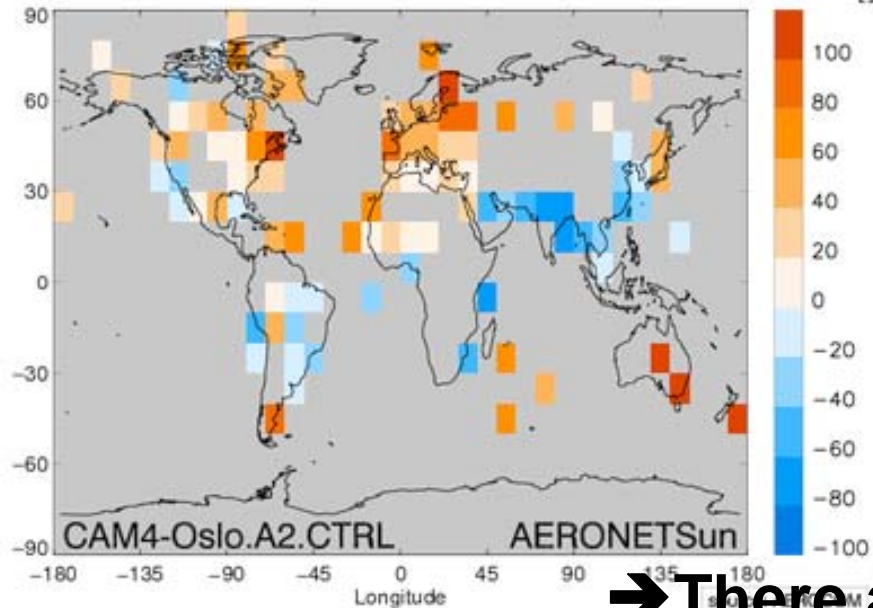
OD550\_AER Mean Bias M:2008 O:2008

[ ]



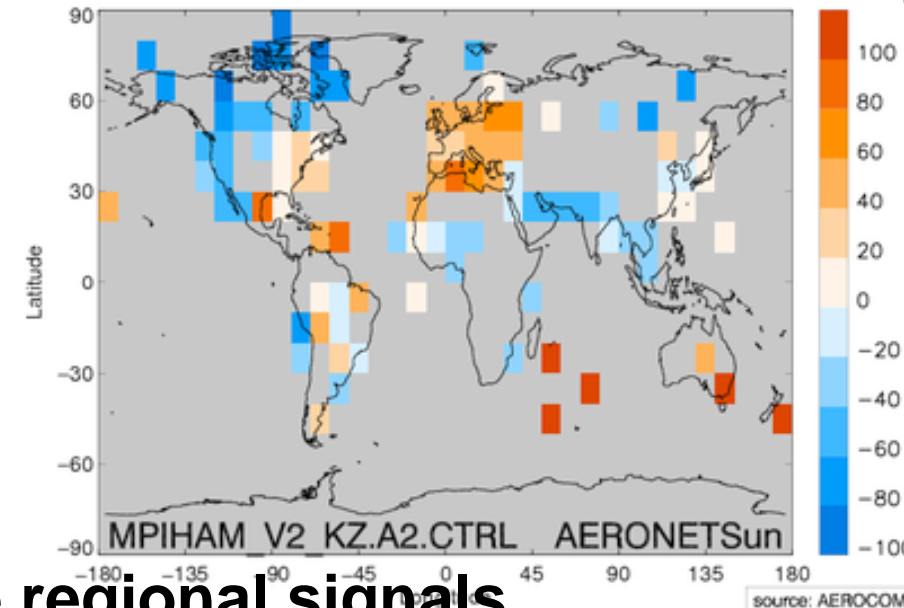
OD550\_AER Mean Bias M:9999 O:2008

[ ]



OD550\_AER Mean Bias M:2006 O:2008

[ ]

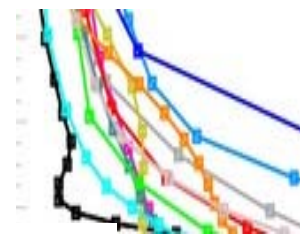


→ There are regional signals

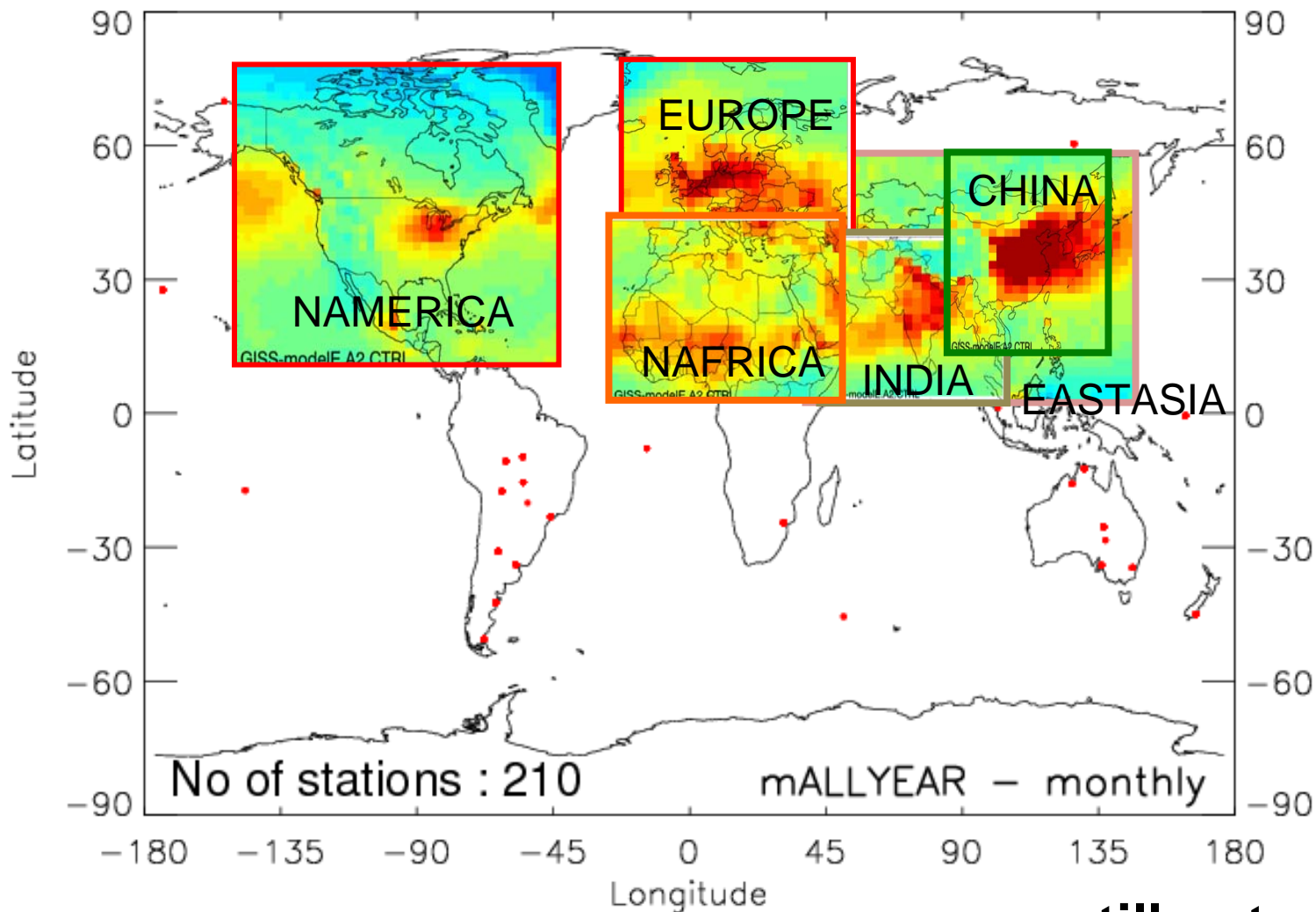
source: AEROCOM



# Regional choices so far on AeroCom web interface



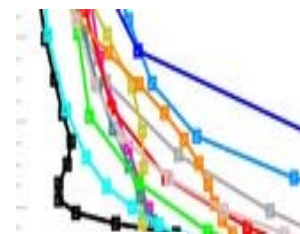
OD550\_AER WORLD station list 2006



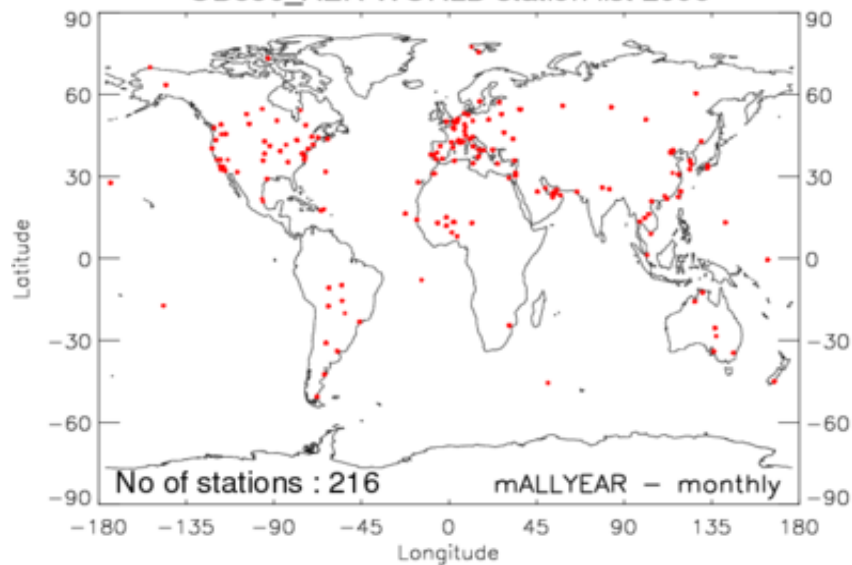
....still not perfect



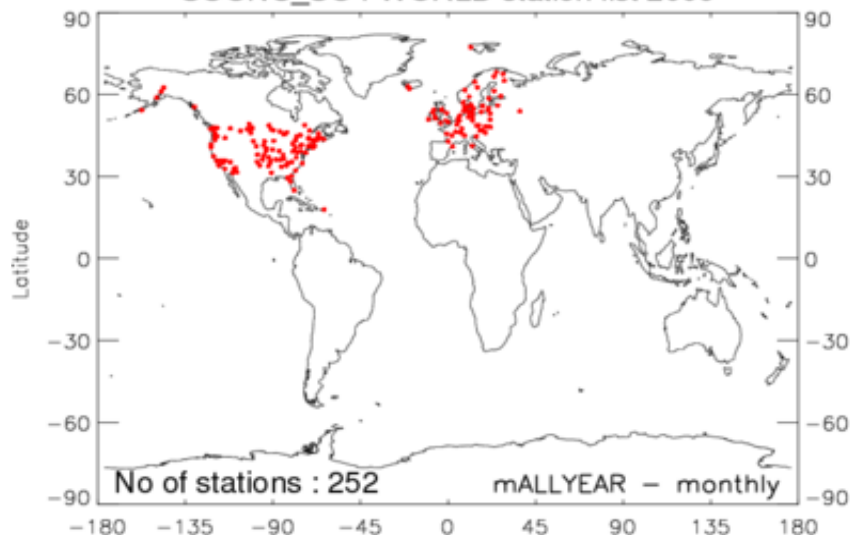
# Where are the stations?



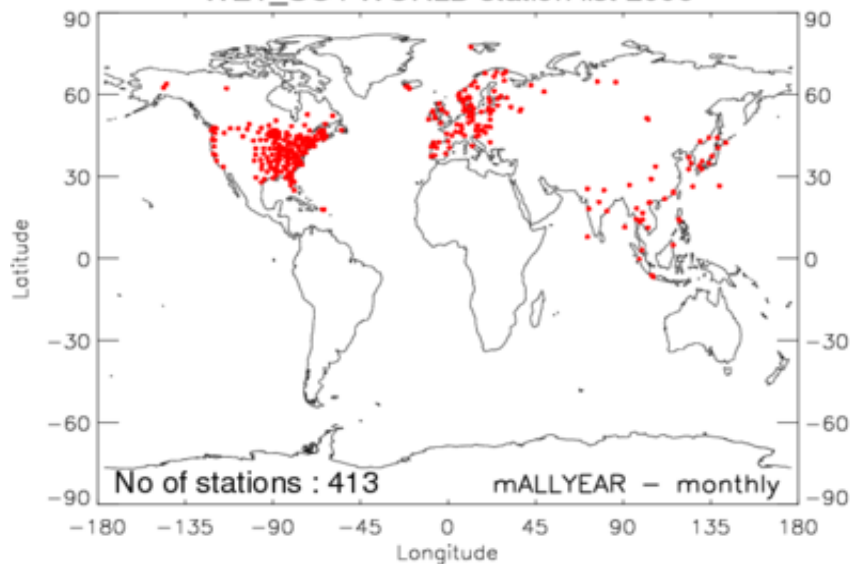
OD550\_AER WORLD station list 2006



SCONC\_SO4 WORLD station list 2006



WET\_SO4 WORLD station list 2006

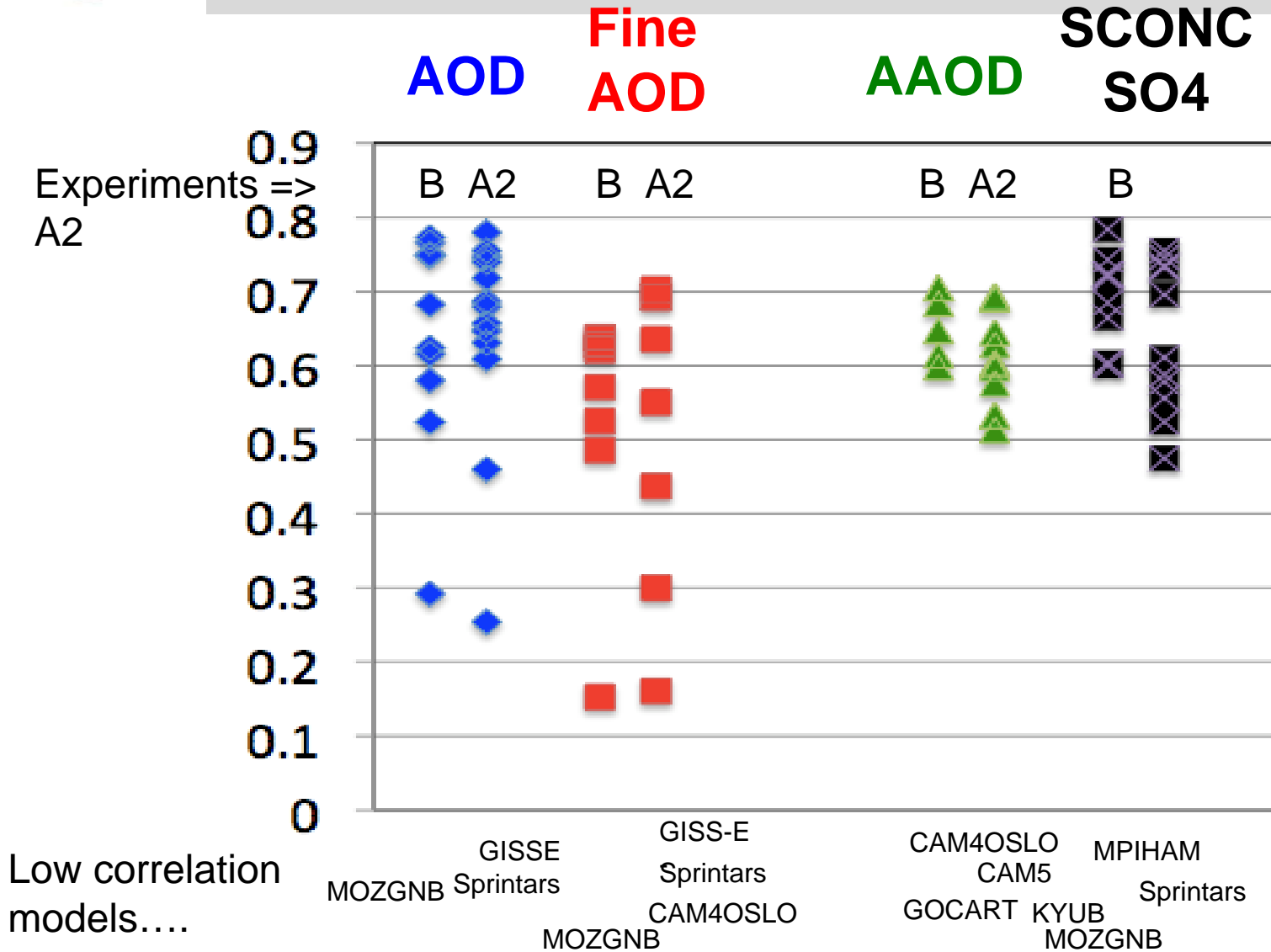
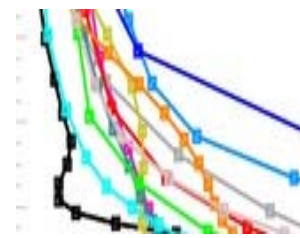


- ...Aeronet: twice as many sites in climatology 2000-2009
- ...not very balanced for sulfate Surface concentration
- ...use of SO4 wet deposition preferred (in progress)





# Correlation to monthly aggregated data Several parameters



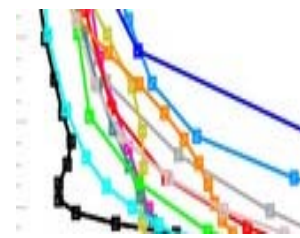
Low correlation models....

....check models individually

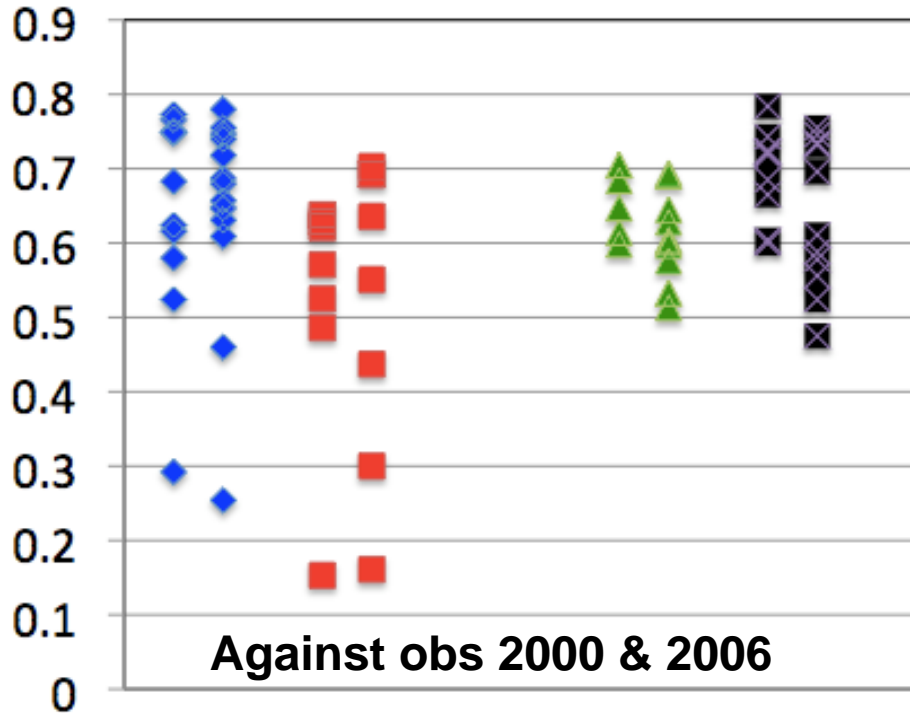


# Correlation to monthly aggregated data

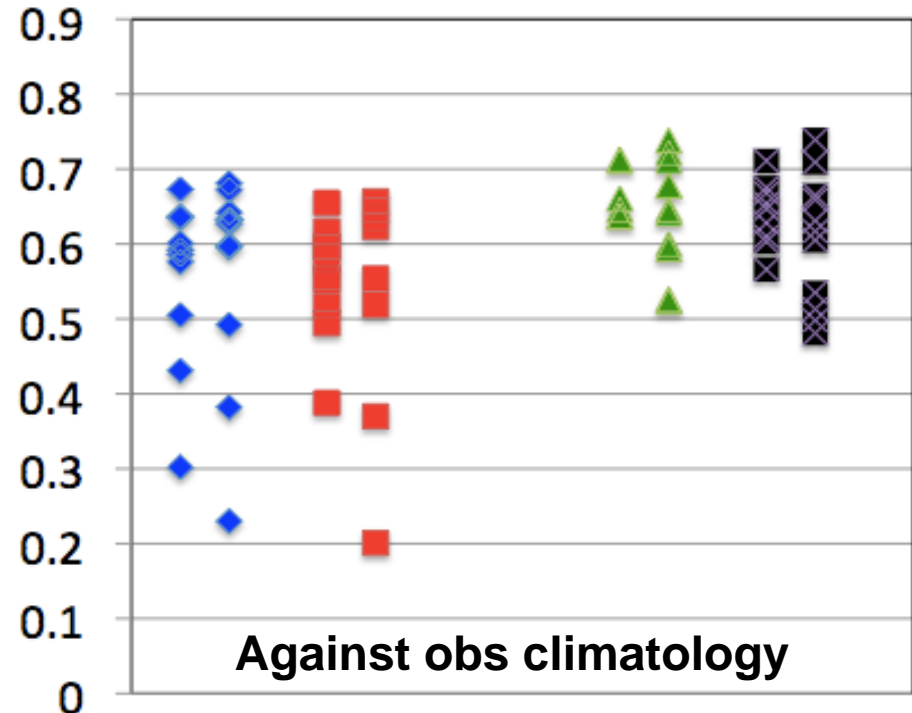
## Several parameters two time frames



### Correlation Coeff



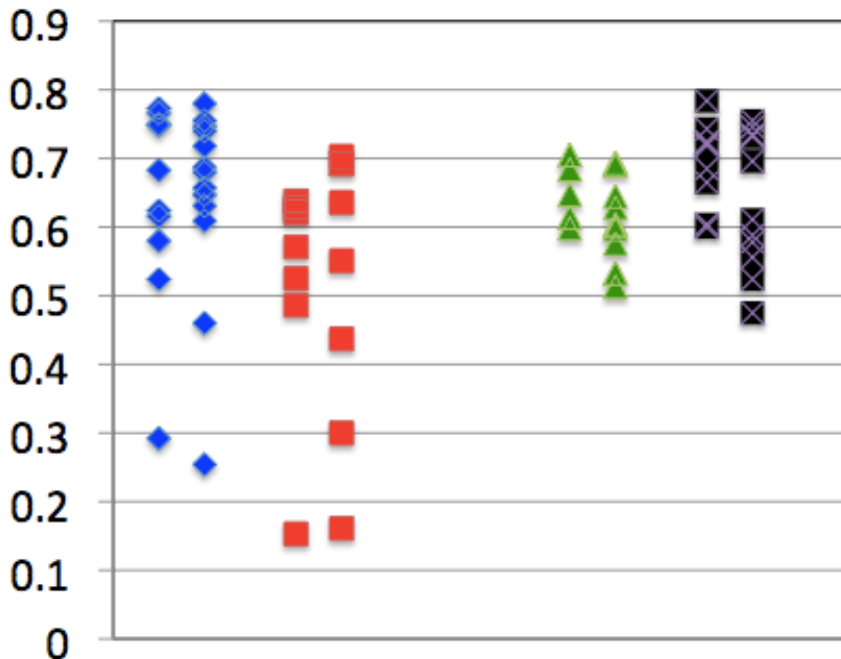
### Correlation Coeff



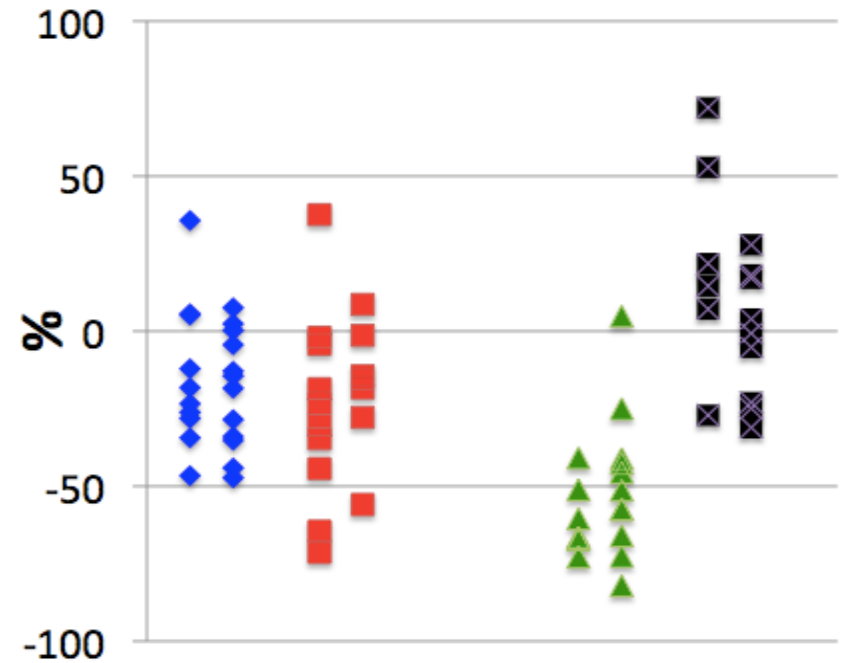
**AOD**      **Fine**  
**AOD**

**AAOD**      **SCONC**  
**SO4**

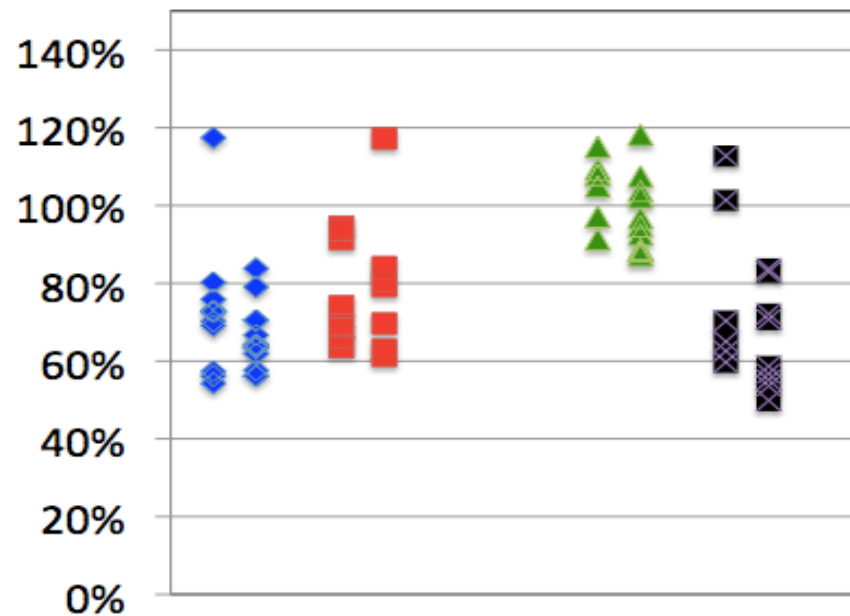
### Correlation Coeff



### NMBias



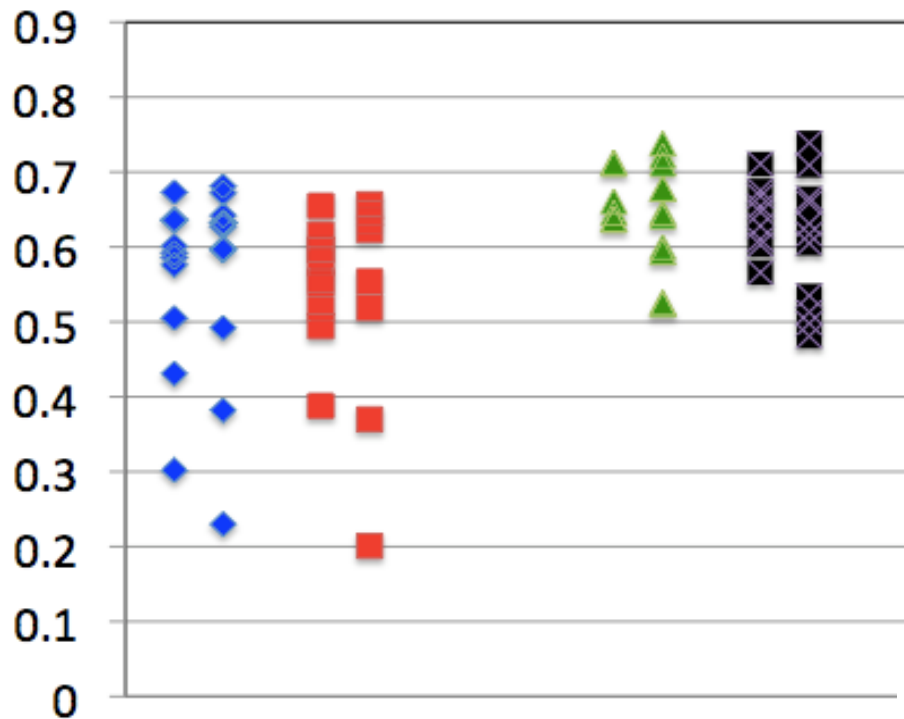
### RMS/ObsMean



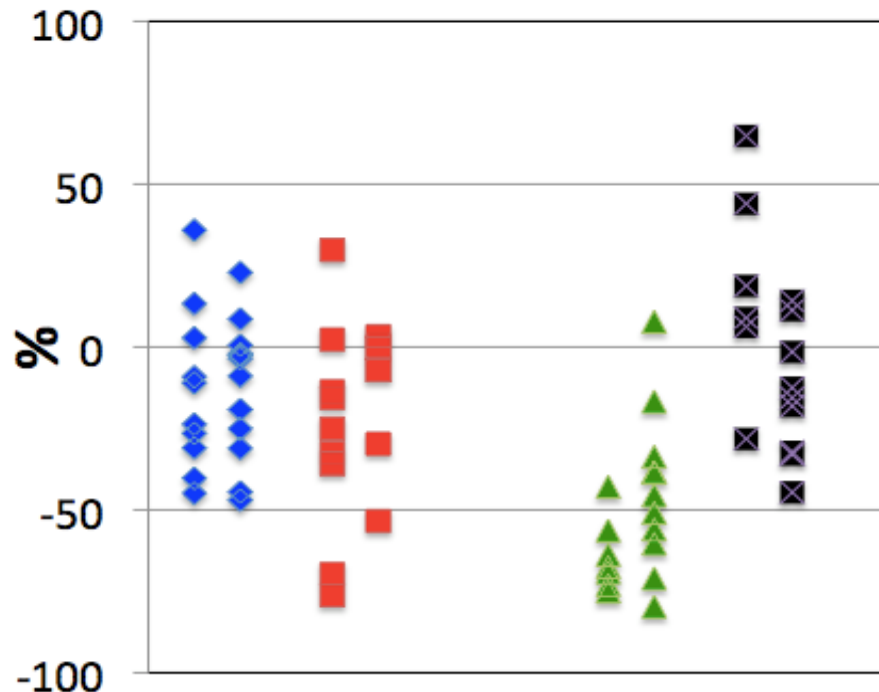
Against obs 2000 & 2006

**AOD**      **Fine AOD**      **AAOD**      **SCONC SO4**

### Correlation Coeff

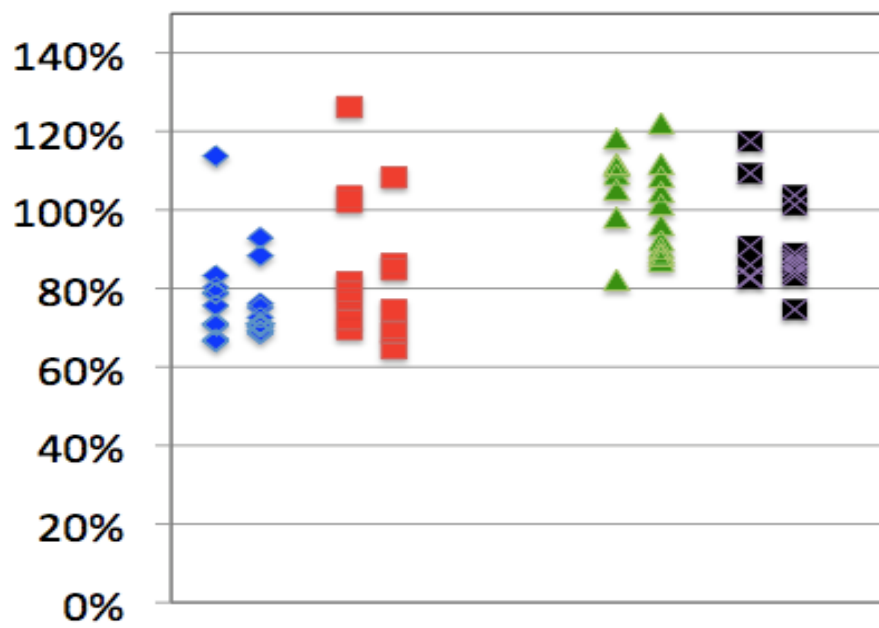


### NMBias



Against obs climatology

### RMS/ObsMean

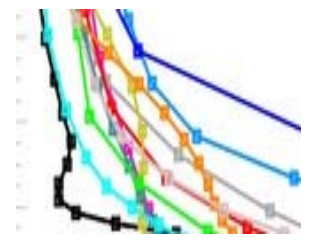


**AOD**      **Fine AOD**      **AAOD**      **SCONC SO4**



## Summary

### Correlation, bias and rms analysis



.... Check outliers and include missing models pending

Model generations A/B and A2 are quite different

Only AOD seemed to have improved

Using 2000 vs 2006 influences A/B vs A2 comparison for r+rms

R and RMS worse against climatology

Bias 2000/06 similar to climatology 2000-2009

Fine mode AOD and AAOD are consistently more problematic

Underestimate of AOD < fine AOD < AAOD (50%)

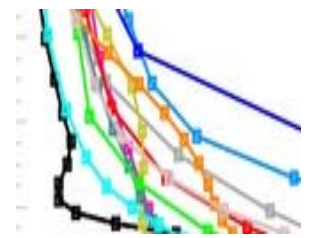
Sulfate surface concentration seems to be overestimated

(more in 2000 than in 2006... emissions in model&reality?)





# Multiple regression of AOD species versus total AOD



Assuming

Sum of diagnosed AOD species contribution is total AOD  
Average regional and species linear correction factors  $a$  apply

$$\text{AOD}_{j \text{ observed}} = c + \sum a_{ij} * \text{AOD}_{ij \text{ modelled}}$$

$j$ = regions     $i$ =aerosol species     $c$ =constant

Solving with linear multiple regression analysis  
Against Aeronet monthly AOD

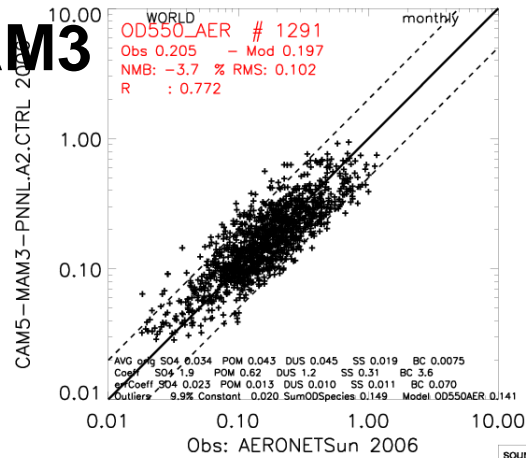
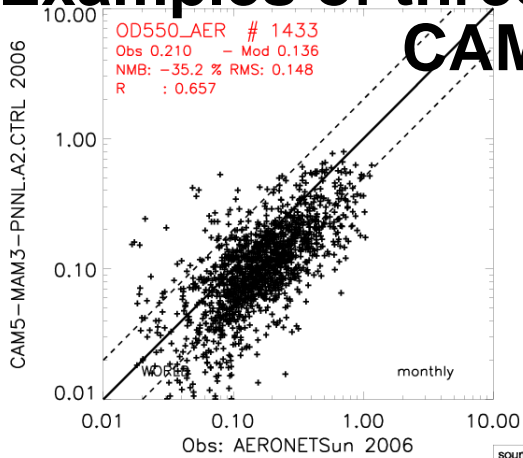
Assuming error 10% in observed AOD

Neglecting model data It/gt factor 3 ( 2-10% outliers)

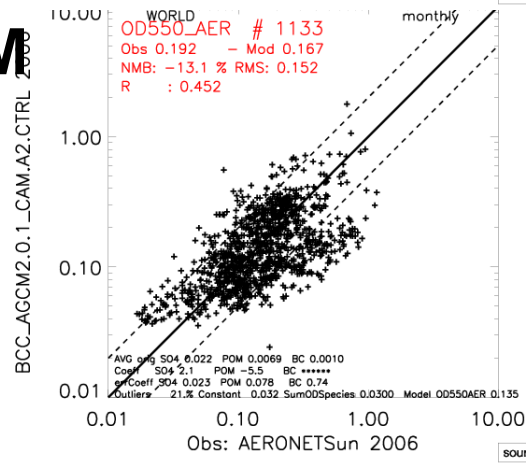
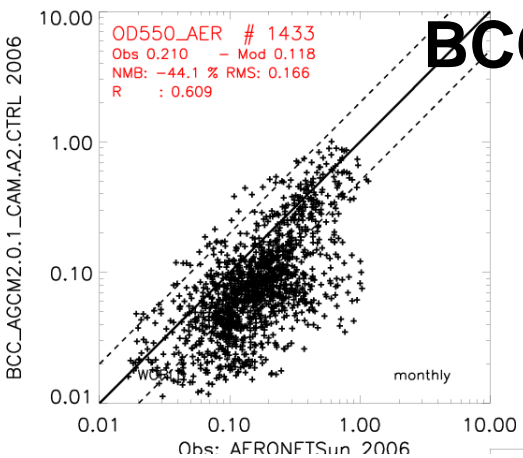


# Examples of three fits

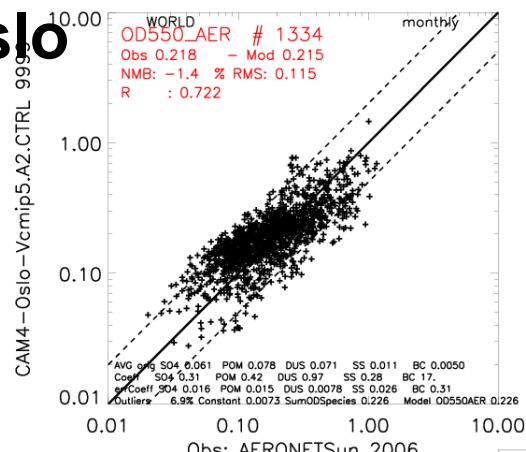
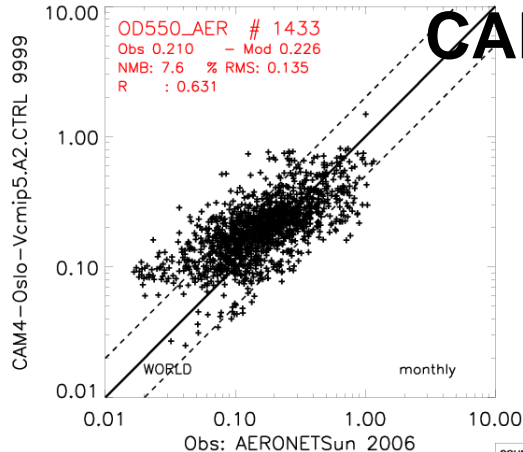
## CAM5-MAM3



## BCC-CAM3

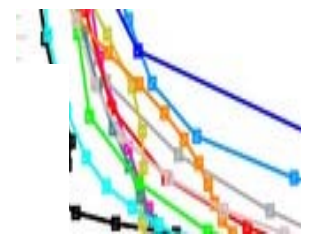


## CAM4-Oslo



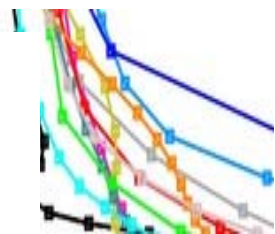
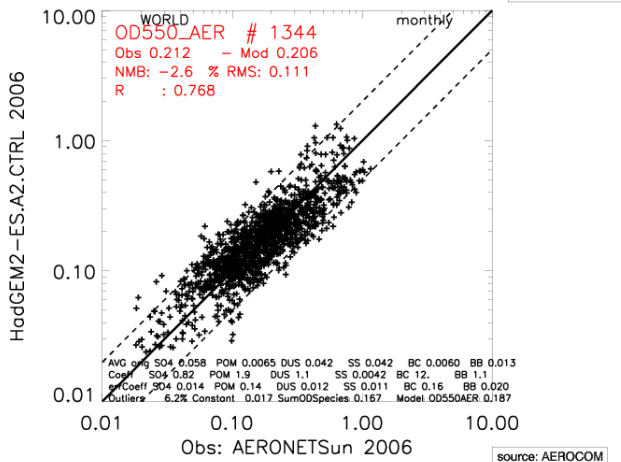
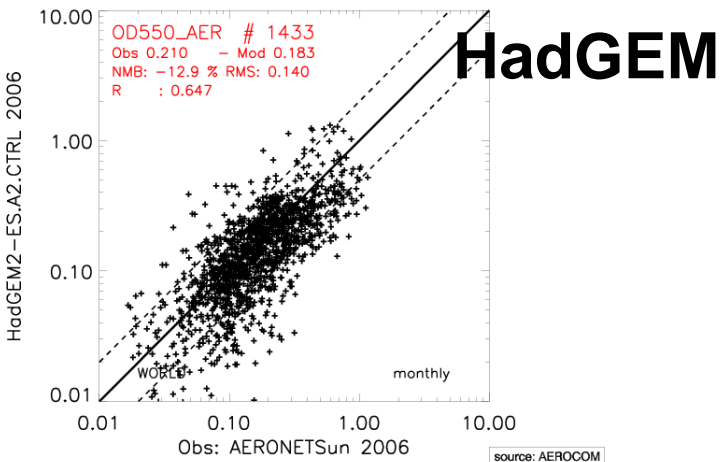
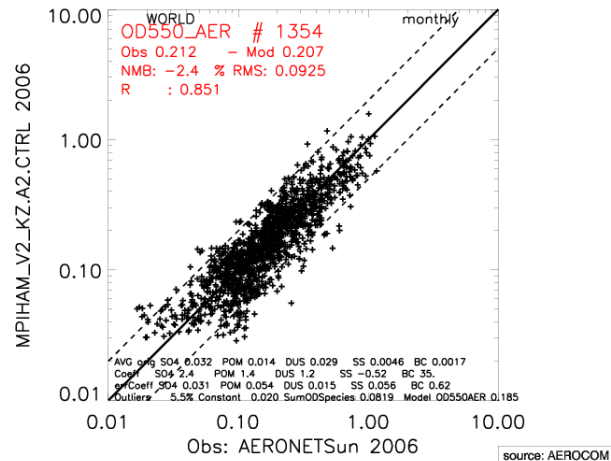
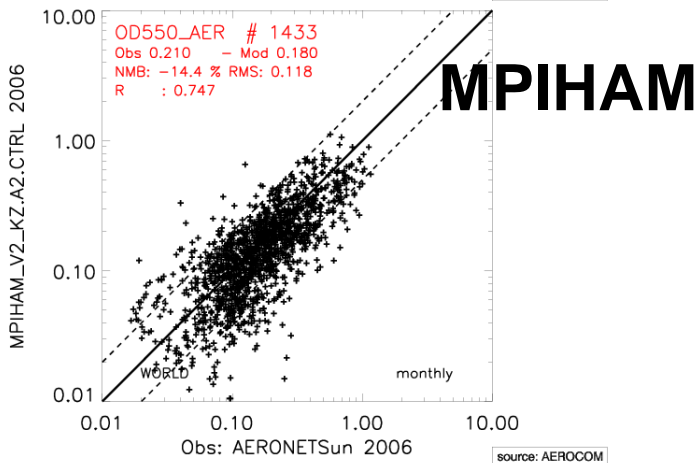
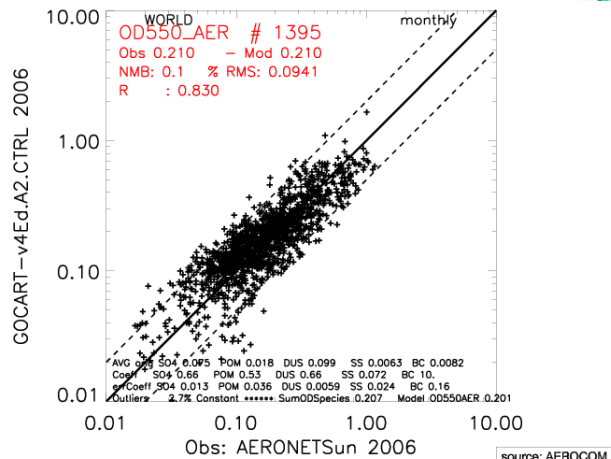
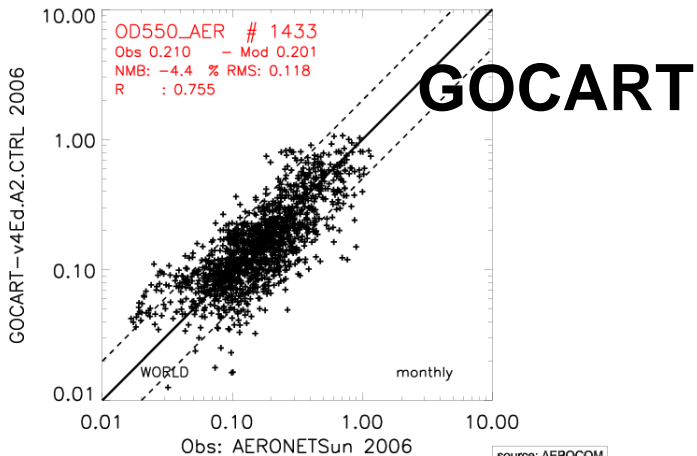
Original model data

Fitted model composition





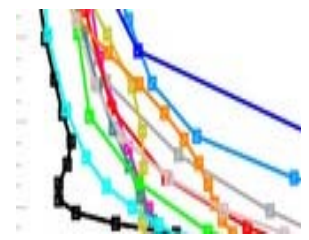
Original model data



Fitted model composition



## Fit implications on AOD composition



So .....

what change in aerosol composition is needed to  
Better fit the variability in observed total AOD?

Assuming that the models have just a linear factor wrong

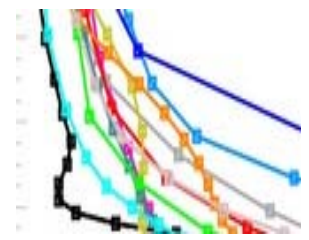
Factor =

any combination of extinction coefficient, life time, emission

***After preliminary inspection, omitting “strange” models:  
MOZGNB, MPIHAM B&A2,  
SPRINTARS A2, BCC-AGCM, TM5.A2 for now....***



# Overall mean (15 model versions B&A2) result of AOD compositon fit

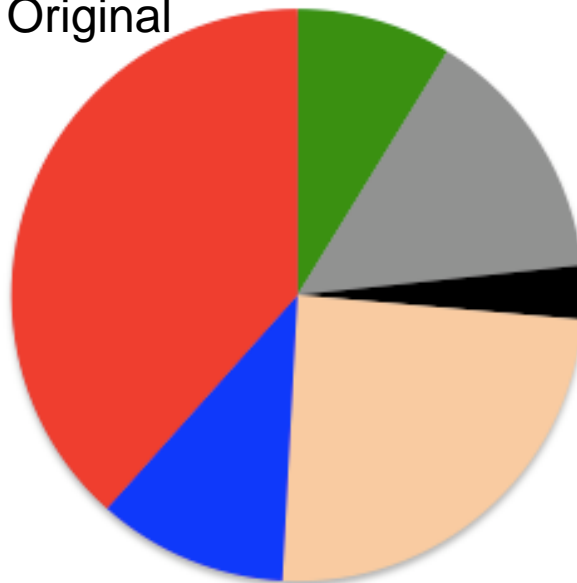


	Observation	Model	Fitted Model
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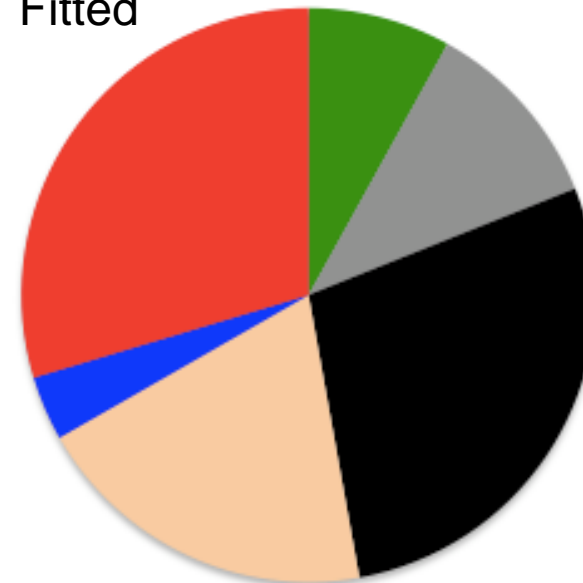
Mean AOD	0.195	0.186	0.188
Correlation		0.64	0.78
RMS		0.147	0.097

World  
Aerosol  
Composition  
At Aeronet Sites

Original



Fitted

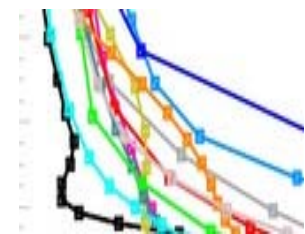


**BB**  
**POM**  
**BC**  
**DUST**  
**SS**  
**SO4**

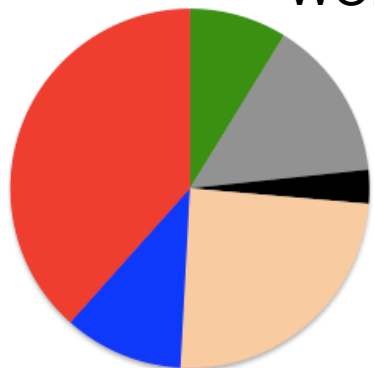




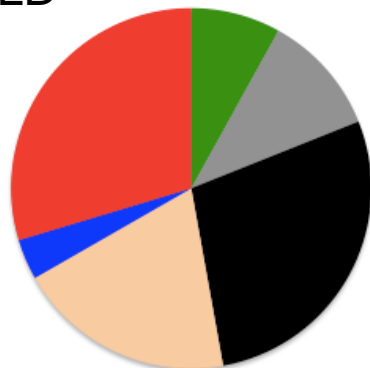
# AOD Composition before/after fit World and three regions



Original WORLD



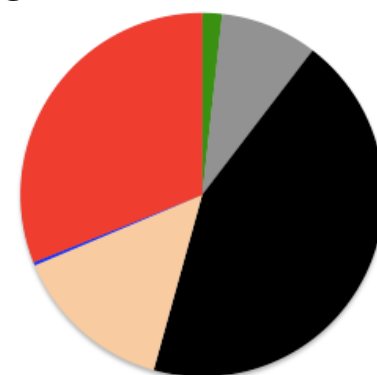
Fitted



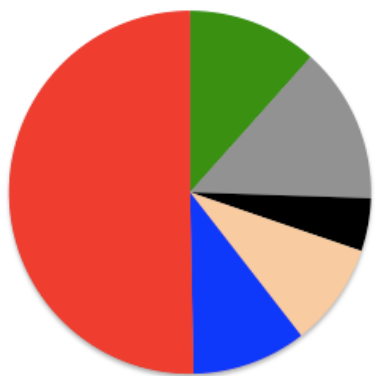
Original EUROPE



Fitted



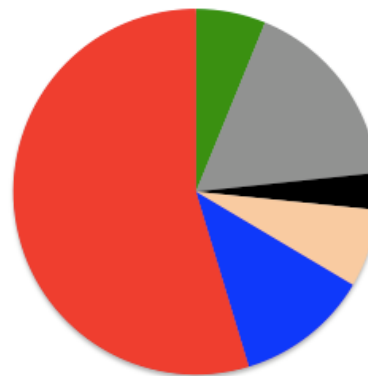
Original EASTASIA



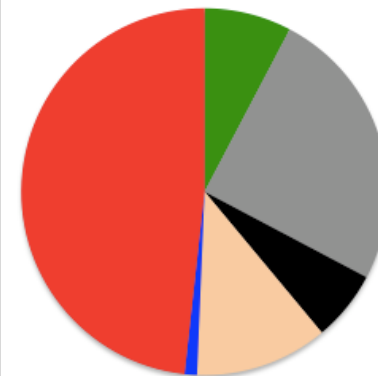
Fitted



Original NAMERICA



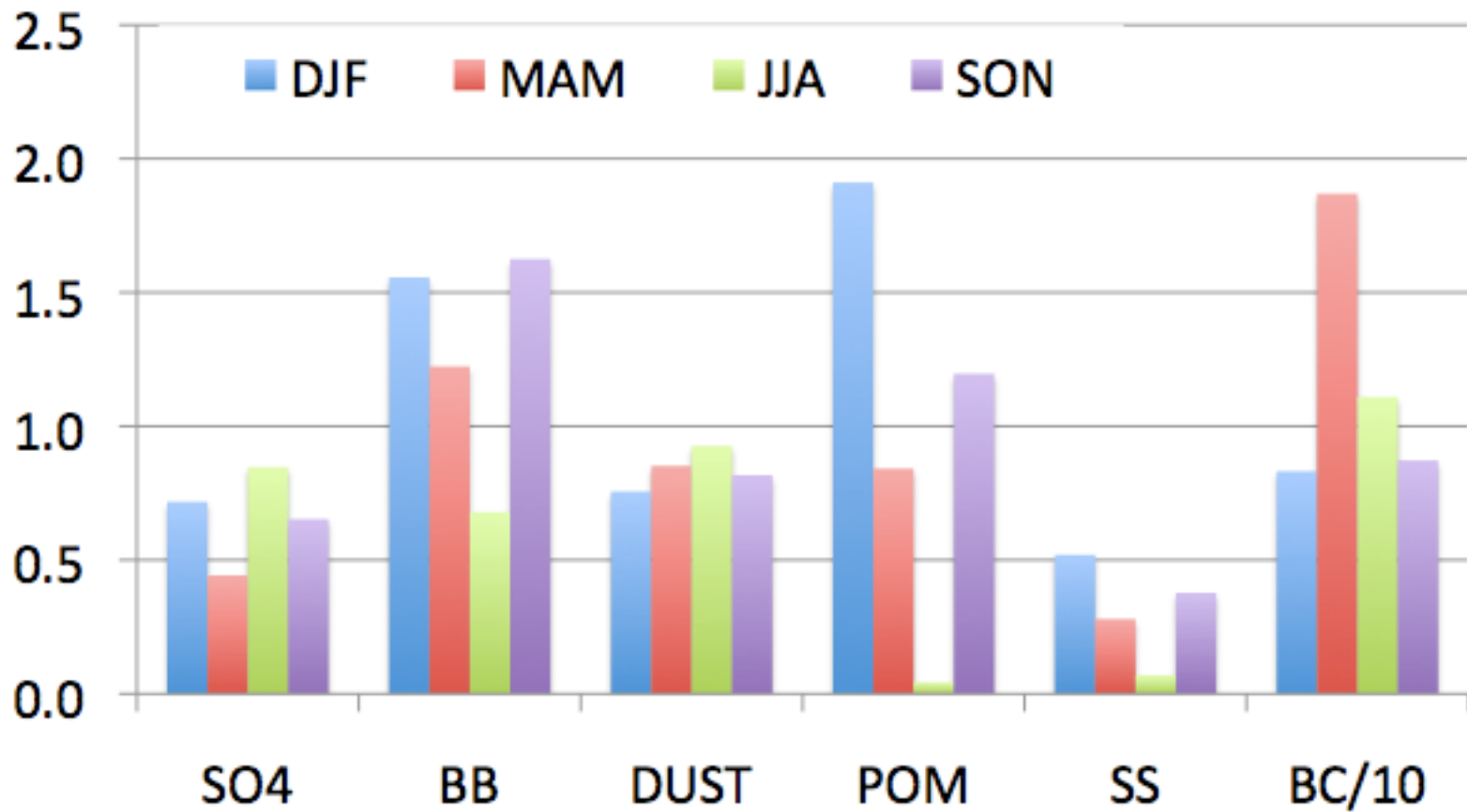
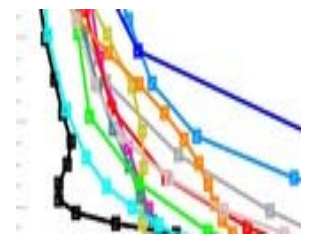
Fitted



**BB**  
**POM**  
**BC**  
**DUST**  
**SS**  
**SO4**



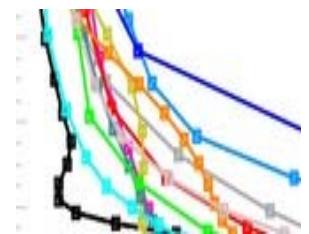
# Regression coefficients in World Calculated for each season





## Summary

Interpretation of regression coefficients  
composition fit to total AOD



SO<sub>4</sub>: Reduction suggested in Europe/Asia + all seasons

BC: 10fold increase suggested ???

Covariance with other primary aerosols?

Underestimate consistent with AAOD evaluation

Asia and Europe BC underestimates most significant

POM: increased suggested in Asia and Namerica

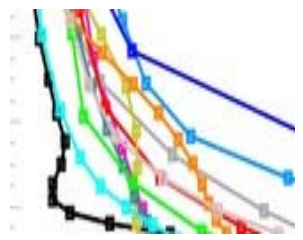
BB: remarkably steady, but seasonal cycle of correction

Seasalt: transport into continents overestimated?

Dust: more in America , less in Asia , no seasonal cycle

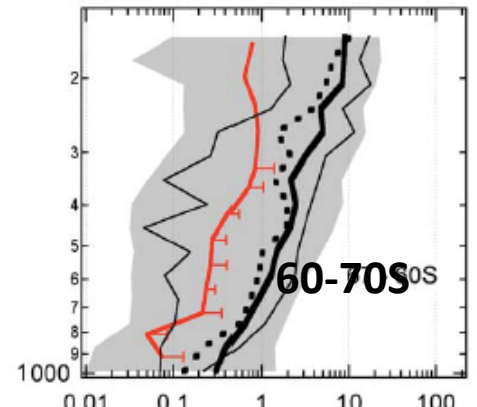
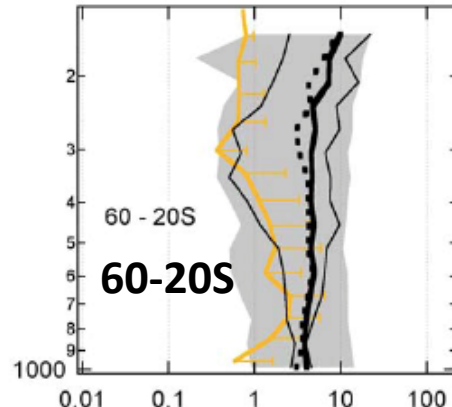
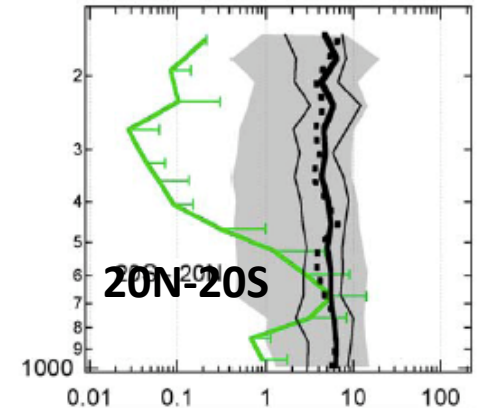
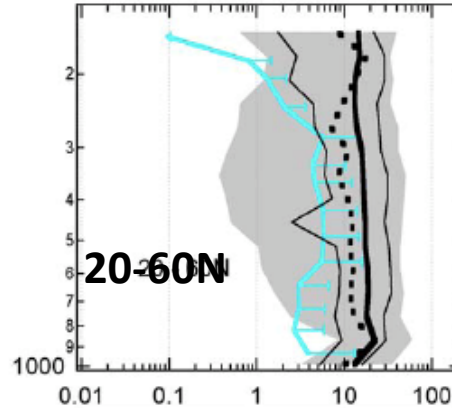
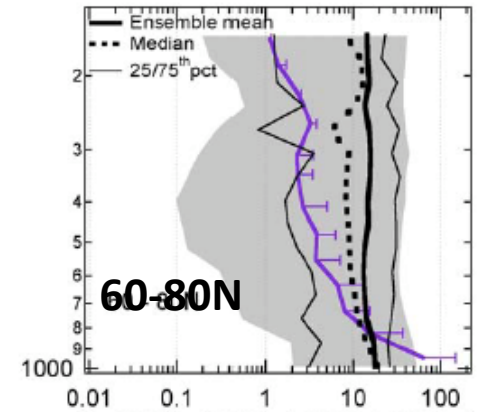
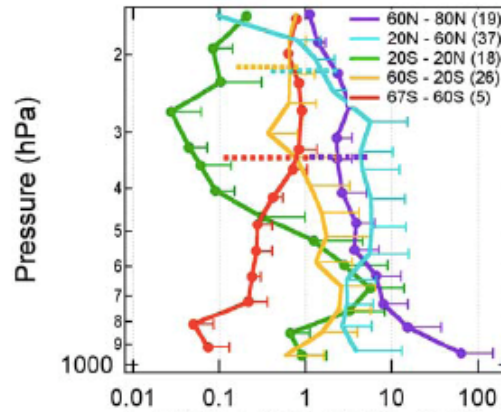
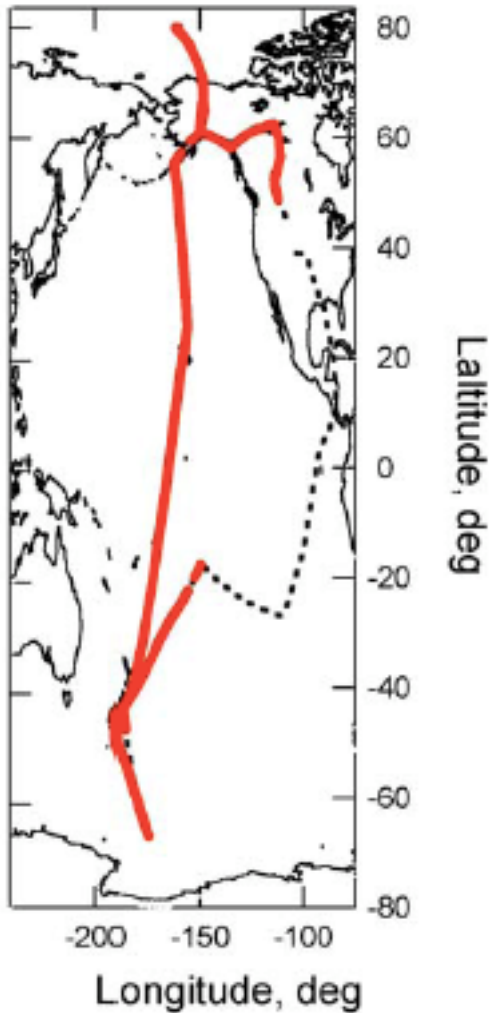


# Discussion constraints for BC



**HIPPO flight campaign  
vs Aerocom models  
refractory Black Carbon**

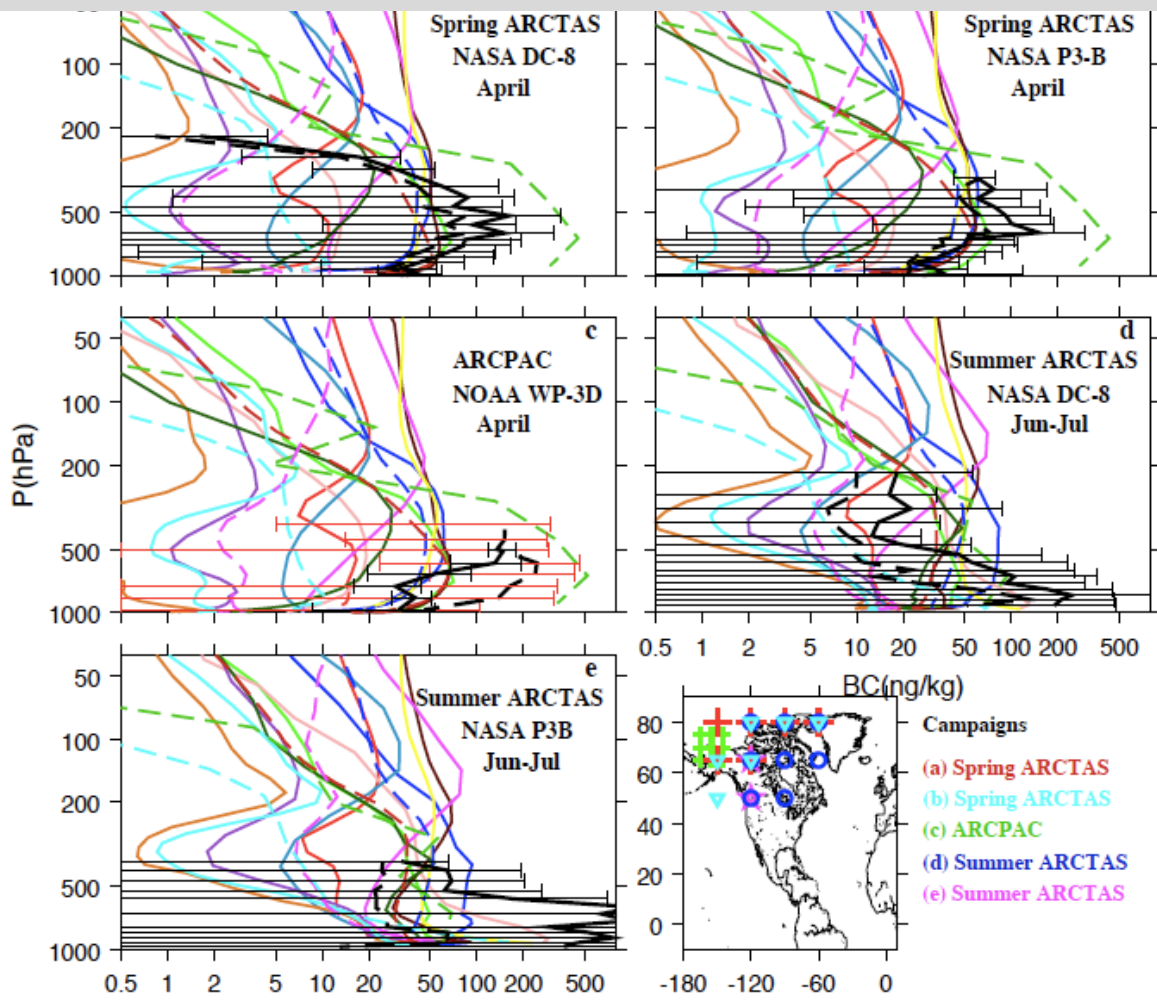
Observed == **measured** BC vertical profiles  
Model Median and Range of model results







# Vertical distribution of BC in Arctic SP2 aircraft measurements



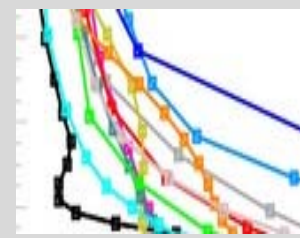
Aircraft campaign Averages  
vs **MODELS**

- Models
- ARQM
  - AM
  - GISS
  - GOCART
  - SPRINTARS
  - LOA
  - LSCE
  - MATCH
  - MOZART
  - MPI
  - MIRAGE
  - UIO CTM
  - UIO GCM (dash)
  - ULAQ (dash)
  - UMI (dash)
  - TM5 (dash)
  - DLR (dash)

*Koch et al. ACP, 2009*



# Looking at the Black Carbon Distribution from different angles



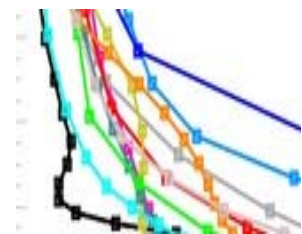
Black Carbon evaluation, AeroCom models against different datasets

Average model biases	N Am	Eur	Asia	S Am	Afr	Rest
Surface concentration	1.6	2.6	0.50	NA	NA	1.4
BC burden	0.42	0.58	0.64	0.42	0.64	0.40
AERONET AAOD	0.86	0.81	0.67	0.68	0.53	0.55
OMI AAOD	0.52	1.6	0.71	0.35	0.47	0.26

Aircraft rBC , Pacific upper Troposphere Pacific, Overestimate  
Aircarft rBC, Arctic mid Troposphere, Underestimate



# outline for a paper ?



explore use of observations to reduce model uncertainty in direct radiative forcing  
(thus emphasis on models with direct radiative forcing estimate in AeroCom)

- ✓ Compare multi-model ensemble to multi-parameter observational dataset
- ✓ Compare phase I and II model submissions
- ✓ Use year of simulation and climatology of obs data to check robustness of quality
- ✓ Document quality of models
- ✓? Find regional AAOD and AOD correction factors (to match observations)
- ? Find regional species-AOD correction factors with multivariate statistics
- ? Adjust regional and species AOD with forcing efficiency for better forcing estimate
- ? Check, if variability in AOD and forcing is reduced
- ? Discuss BC diverse observational constraints specifically
- ? Discuss value of model ensemble AeroCom Median A, B, A2
- ? Discuss anthropogenic fraction uncertainty
- ? Test if weighting models by quality would yield a similar results
- ? Comparison to other forcing estimates
- ? Evaluation against satellite products?