

New capability of Aerosols/Chemical DA for WRF-Chem

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Boulder, CO

Chemical/Aerosol DA – Outline

- Background
- PM2.5 assimilation with GOCART scheme
- Chemical/Aerosol assimilation with MOSAIC scheme
- Conclusions and future works

Background

- To implement chemical assimilation in WRFDA
- To develop a flexible chemical assimilation system that can easily switch between different aerosol schemes
- To improve the forecast of PM_{2.5}/PM₁₀ and other gaseous pollutants.

Major modifications

- BE statistics and I/O for chemical species in GENBE2.0
- I/O of for chemical species in WRFDA
- add analysis variable
- obs I/O and operator
- diagnostics output

Chemical/Aerosol DA – Outline

- Background
- PM2.5 assimilation with GOCART scheme
- Chemical/Aerosol assimilation with MOSAIC scheme
- Conclusions

PM2.5 DA with GOCART

- WRFDA 4.0.3 3DVar

- PM2.5 Assimilation

- GENBE_2.0

- analysis variable (univariate):

p25, bc1, bc2, oc1, oc2, dust1, dust2, seas1, seas2, sulf

- GOCART Scheme

- observation operator:

$$PM_{2.5} = \rho[p25 + bc1 + bc2 + 1.8(oc1 + oc2) + dust1 + 0.286*dust2 + seas1 + 0.942*seas2 + 1.375*sulf]$$

- observation error:

Chen, D., Liu, Z., Ban, J., Zhao, P., and Chen, M.: Retrospective analysis of 2015–2017 winter-time PM2.5 in China: response to emission regulations and the role of meteorology, *Atmos. Chem. Phys. Discuss.*, <https://doi.org/10.5194/acp-2018-890>, 2019.

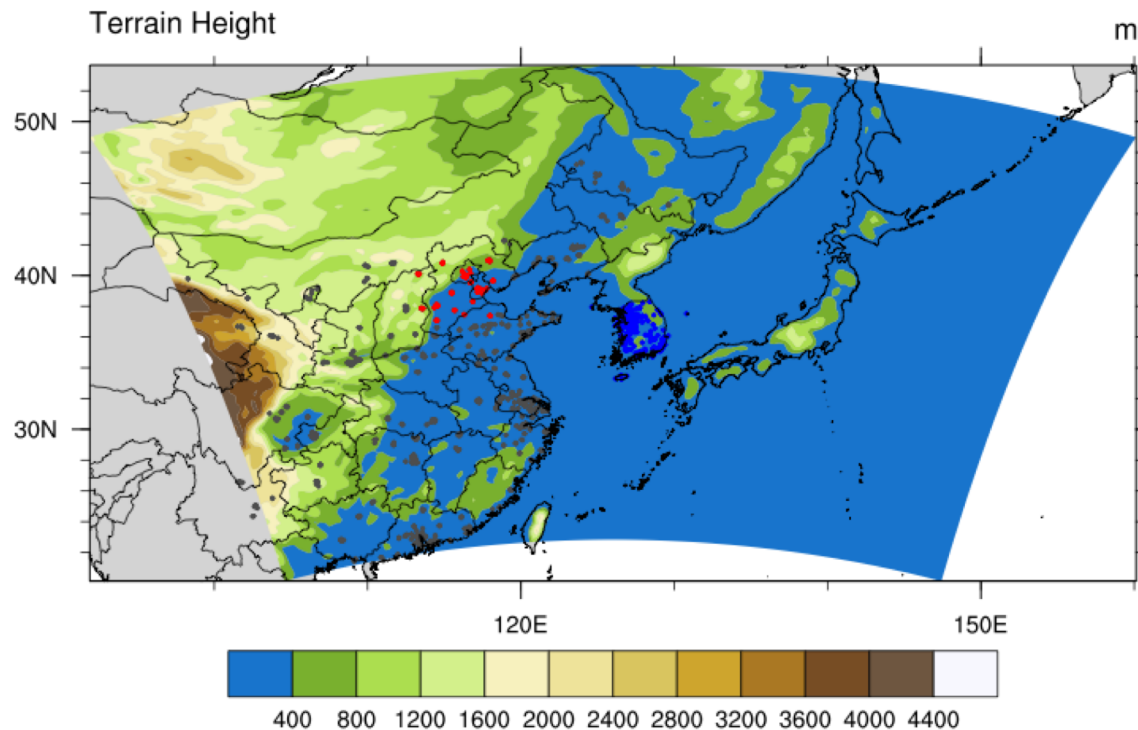
$$\varepsilon_{PM2.5} = \sqrt{\varepsilon_0^2 + \varepsilon_r^2},$$

$$\varepsilon_r = \gamma \varepsilon_0 \sqrt{\frac{\Delta x}{L}},$$

$$\varepsilon_0 = 1.0 + 0.0075 \times \Pi_0$$

DA experiment

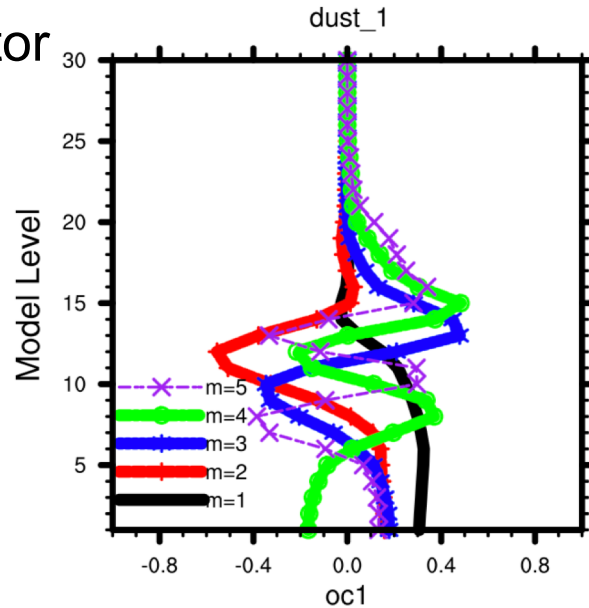
- 20160501—20160507
- 6hr cycling, 24hr forecast at 00UTC
- observation: PM_{2.5} surface concentration over China and South Korea



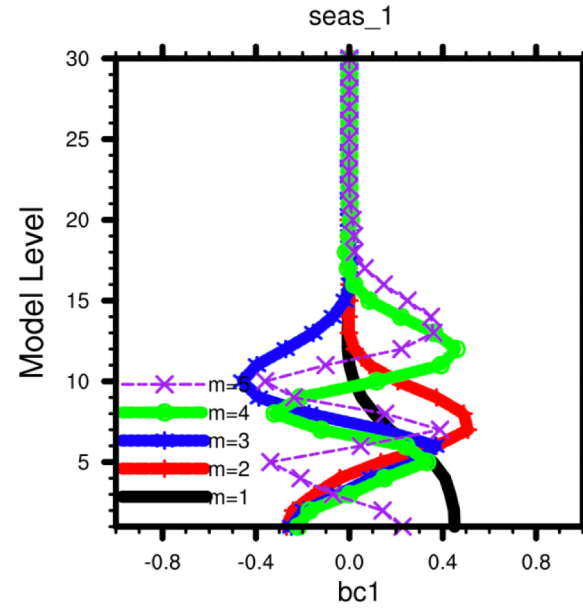
Get chemical statistics in GENBE_2.0

- Eigen Vector

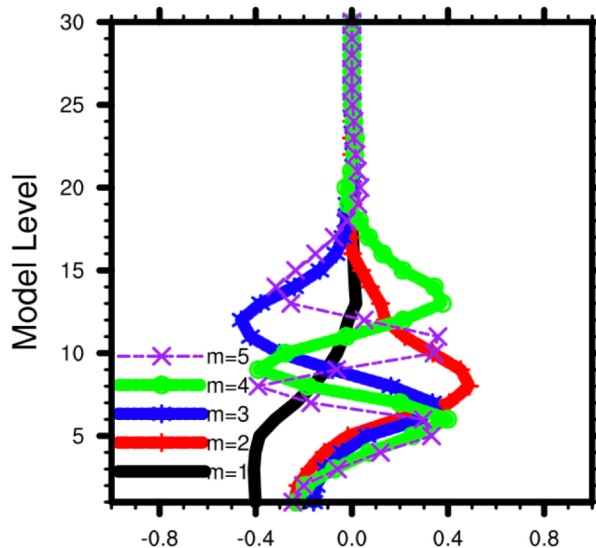
DUST_1



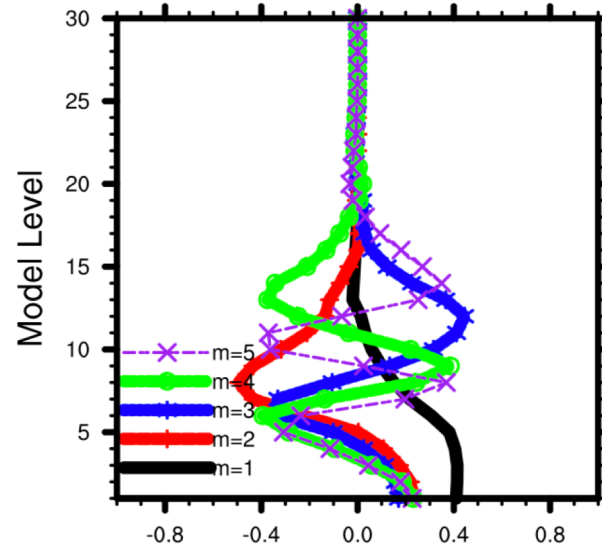
SEAS_1



OC1



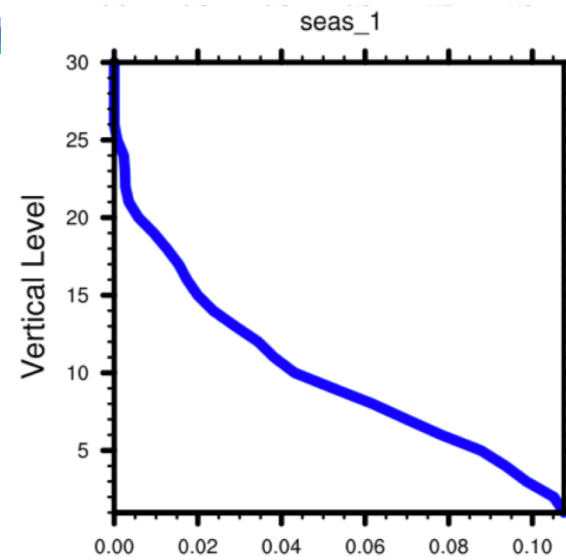
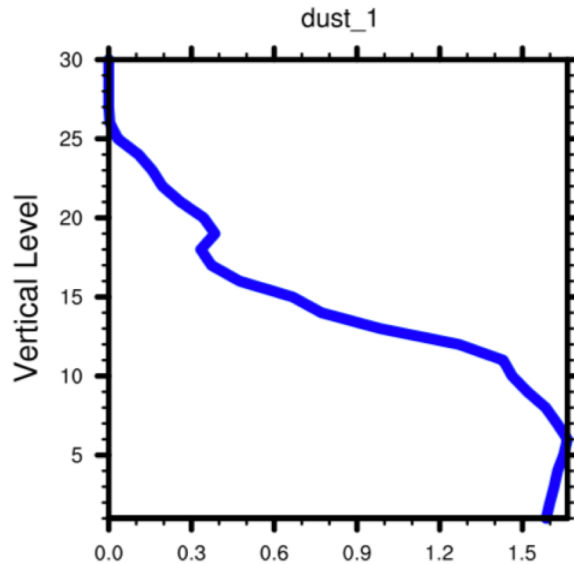
BC1



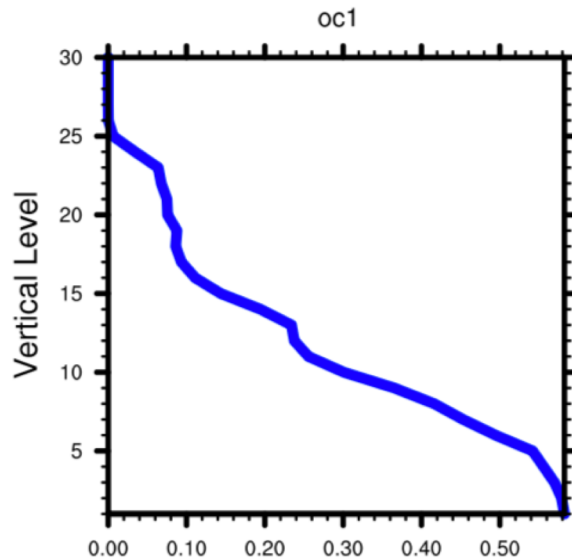
Get chemical statistics in GENBE_2.0

- Std Error

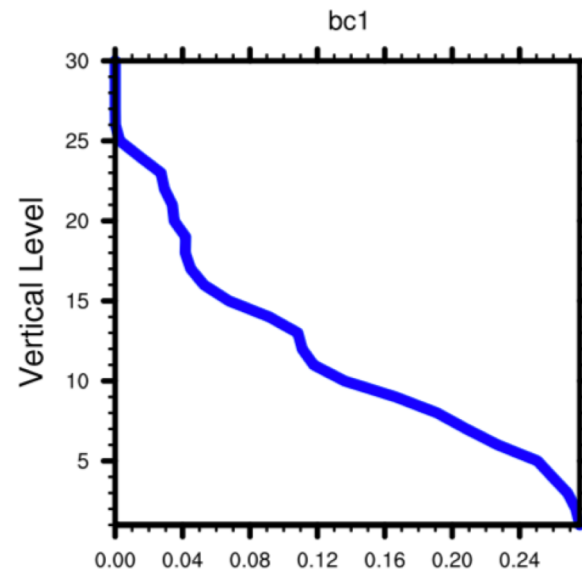
DUST_1



SEAS_1



OC1

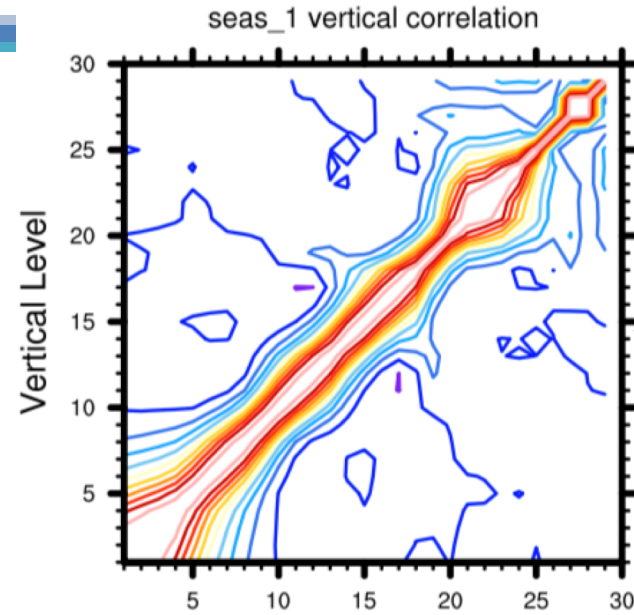
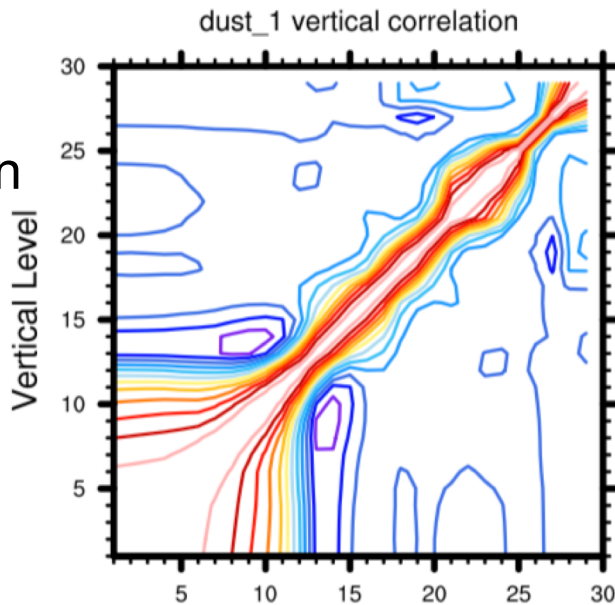


BC1

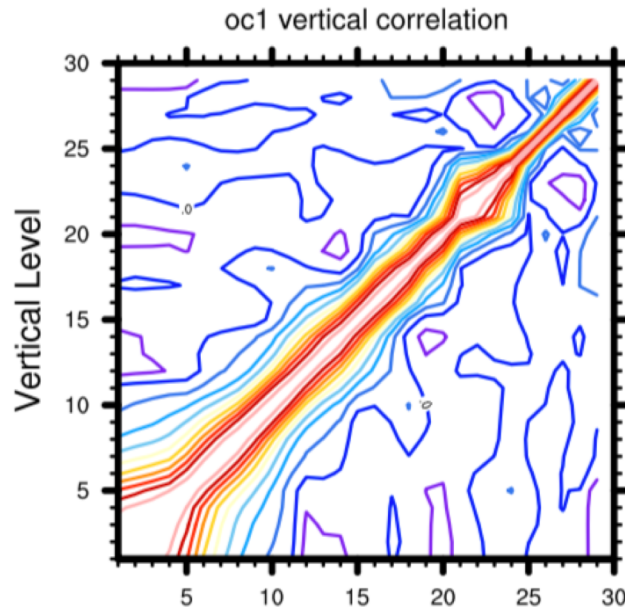
Chemical/Aerosol DA with GOCART

- Vertical Correlation

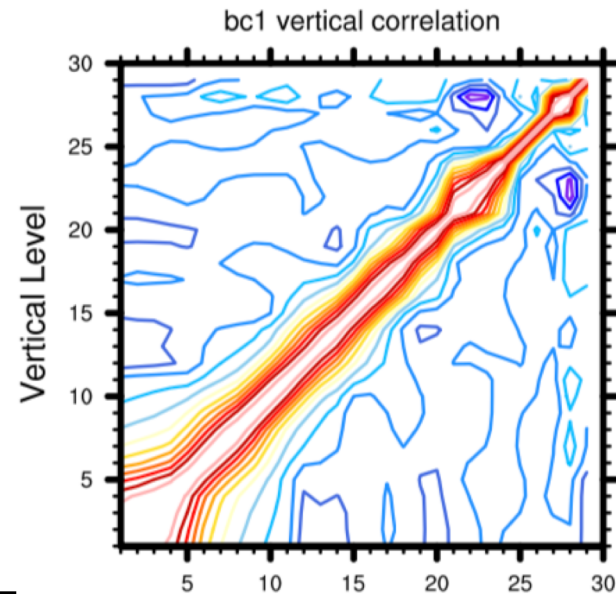
DUST_1



SEAS_1



OC1



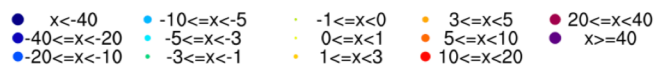
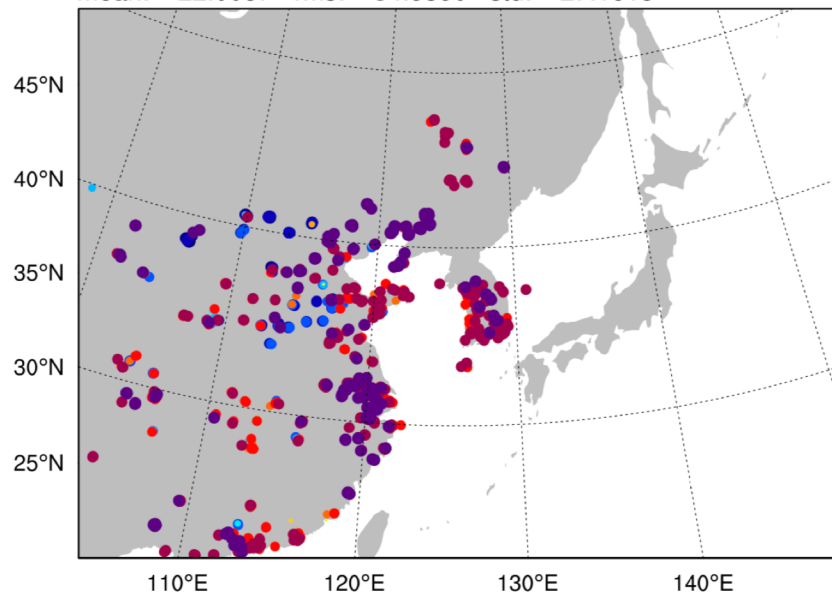
BC1

DA experiment

2016050100 UTC

OMB CHEM PM25 (All: 979)

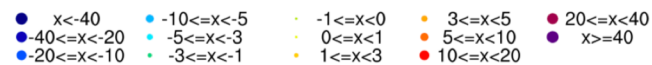
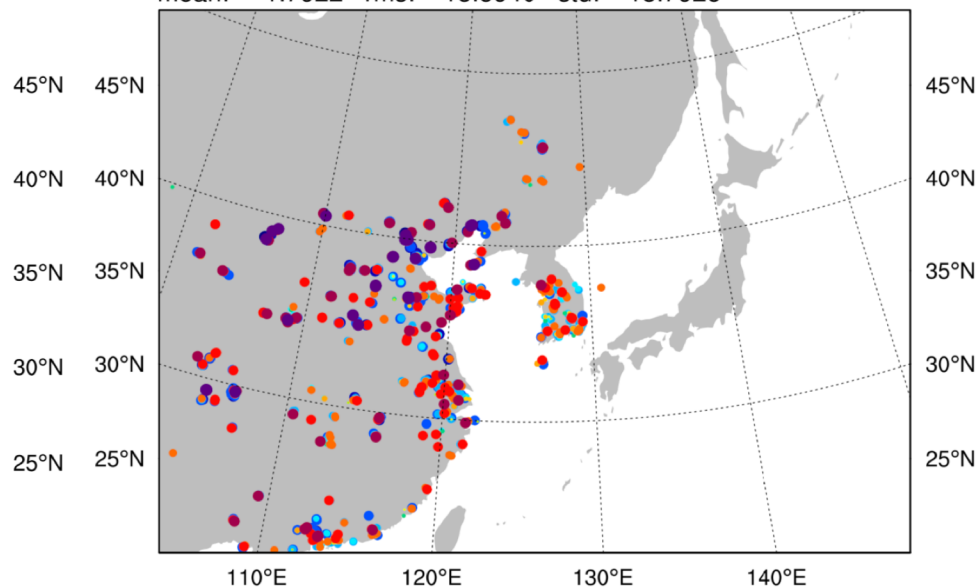
mean: 22.0087 rms: 34.9590 std: 27.1615



OMB

OMA CHEM PM25 (Used: 974)

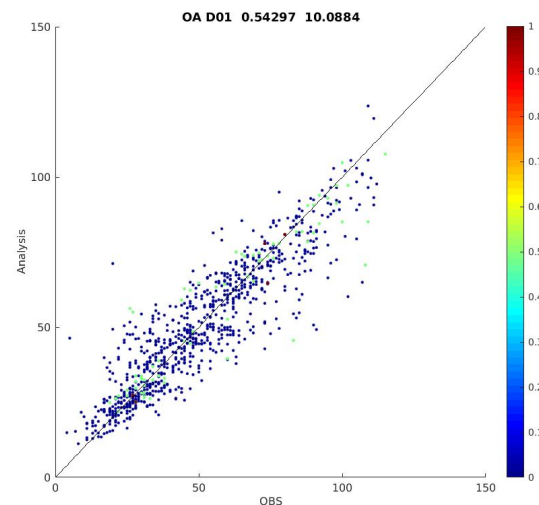
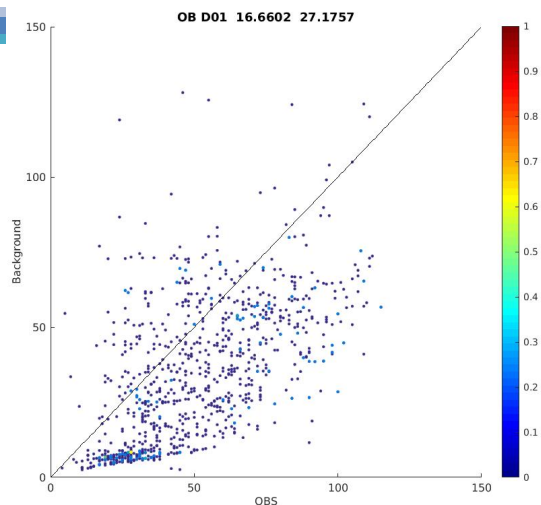
mean: 1.7922 rms: 15.8940 std: 15.7926



OMA

DA experiment

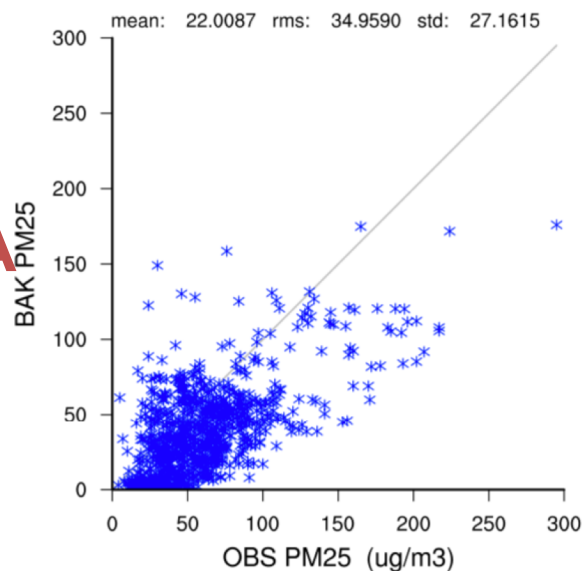
GSI



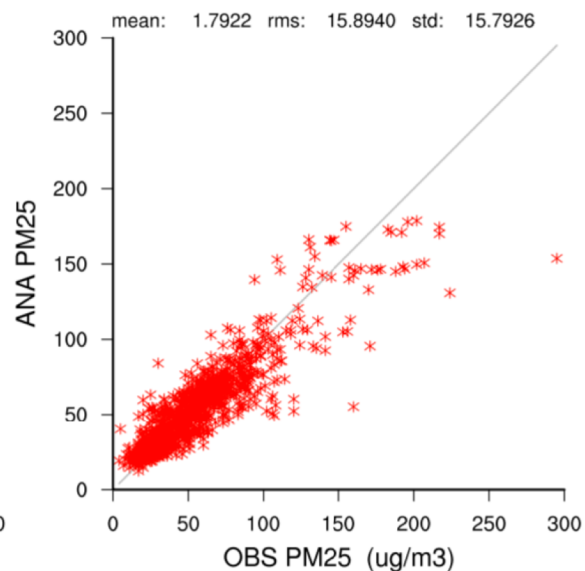
mean: 16.66—0.54
std: 27.18—10.09

2016050100 CHEM 1120 / 974

Used 974



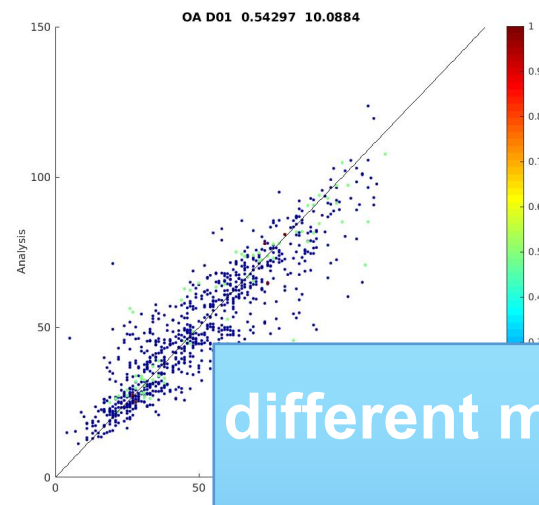
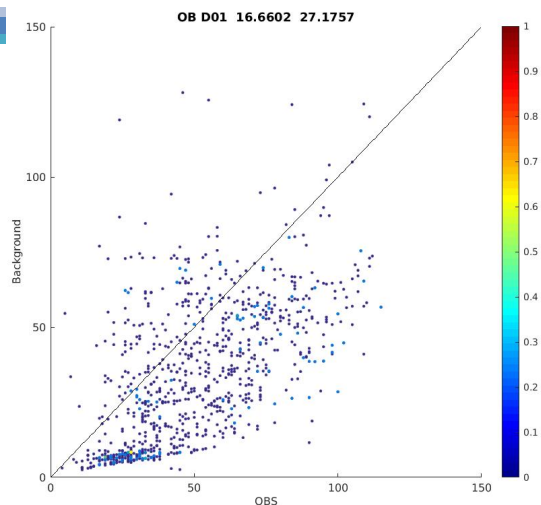
Used 974



mean: 22.01—1.79
std: 27.16—15.79

DA experiment

GSI

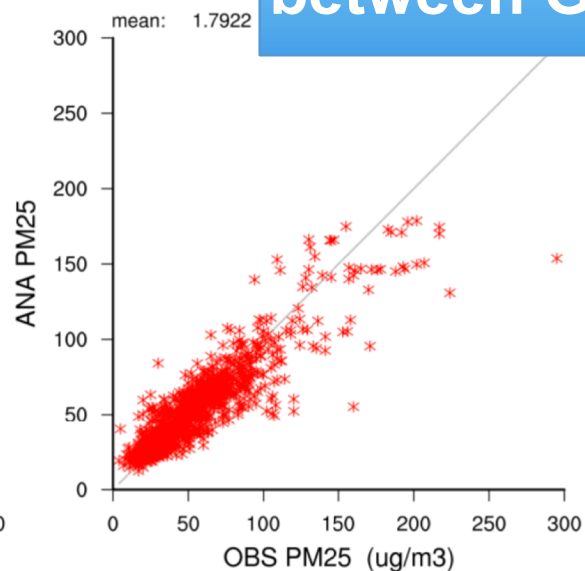
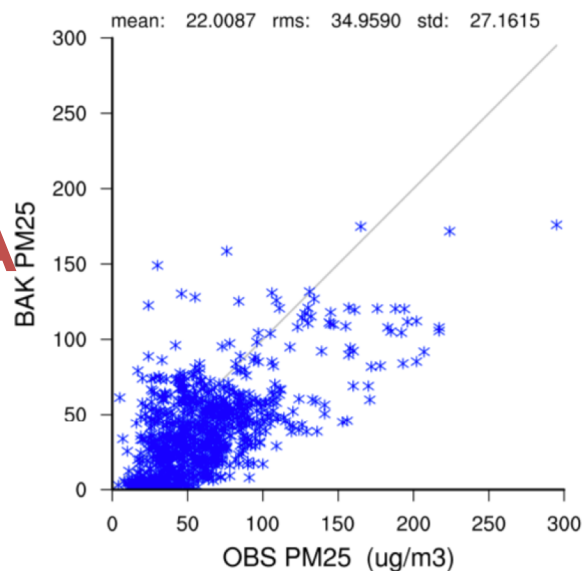


mean: 16.66—0.54
std: 27.18—10.09

different max realistic
obs value and obs err
between GSI and WRFDA

2016050100 CHEM 1120 / 97

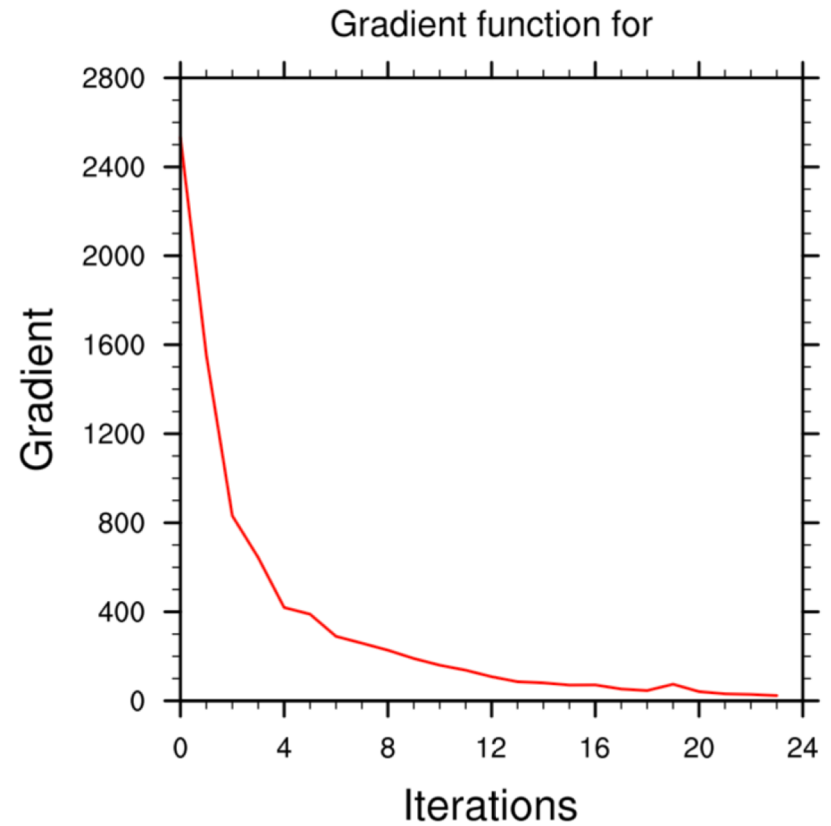
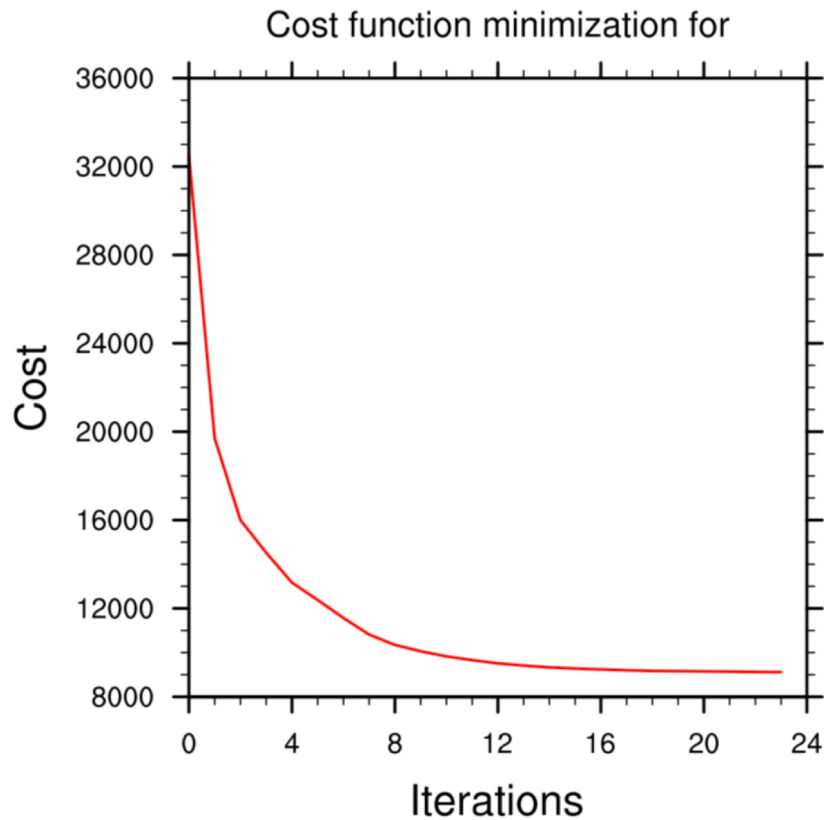
Used 974



mean: 22.01—1.79
std: 27.16—15.79

DA experiment

2016050100 UTC



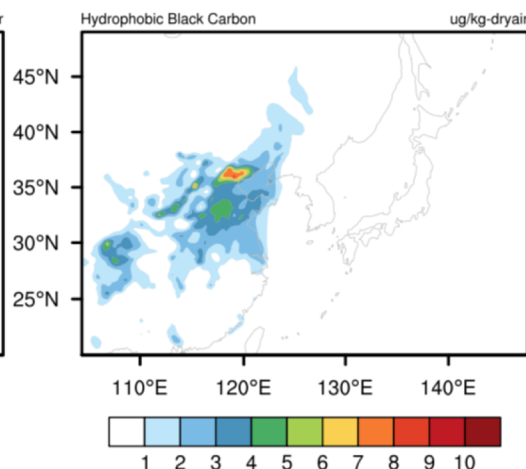
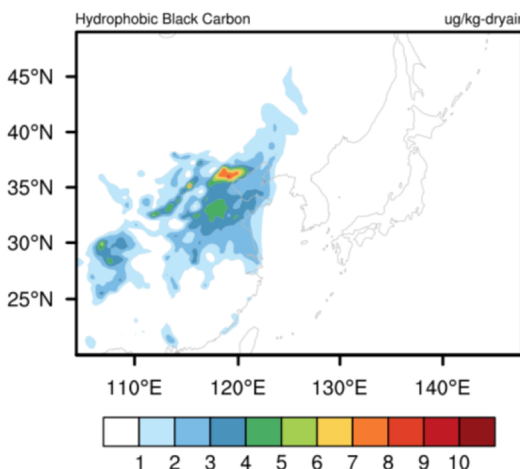
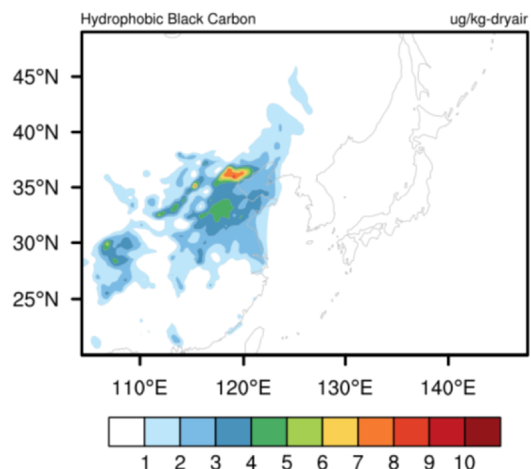
DA experiment

2016050100 UTC **W/O DA**

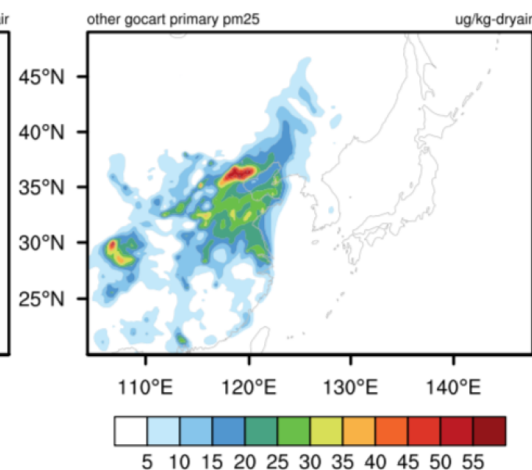
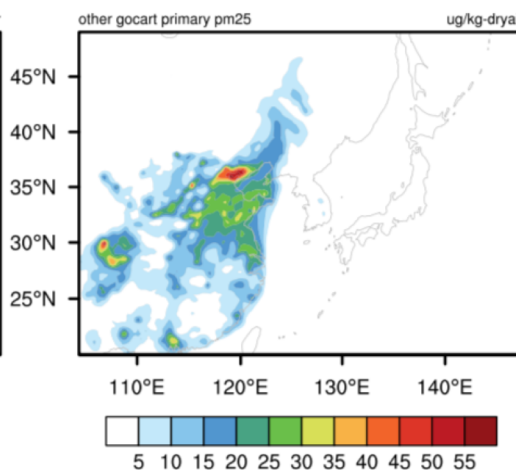
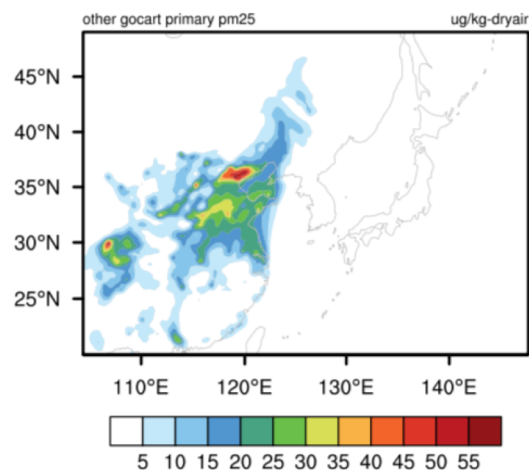
GSI

WRFDA

BC1

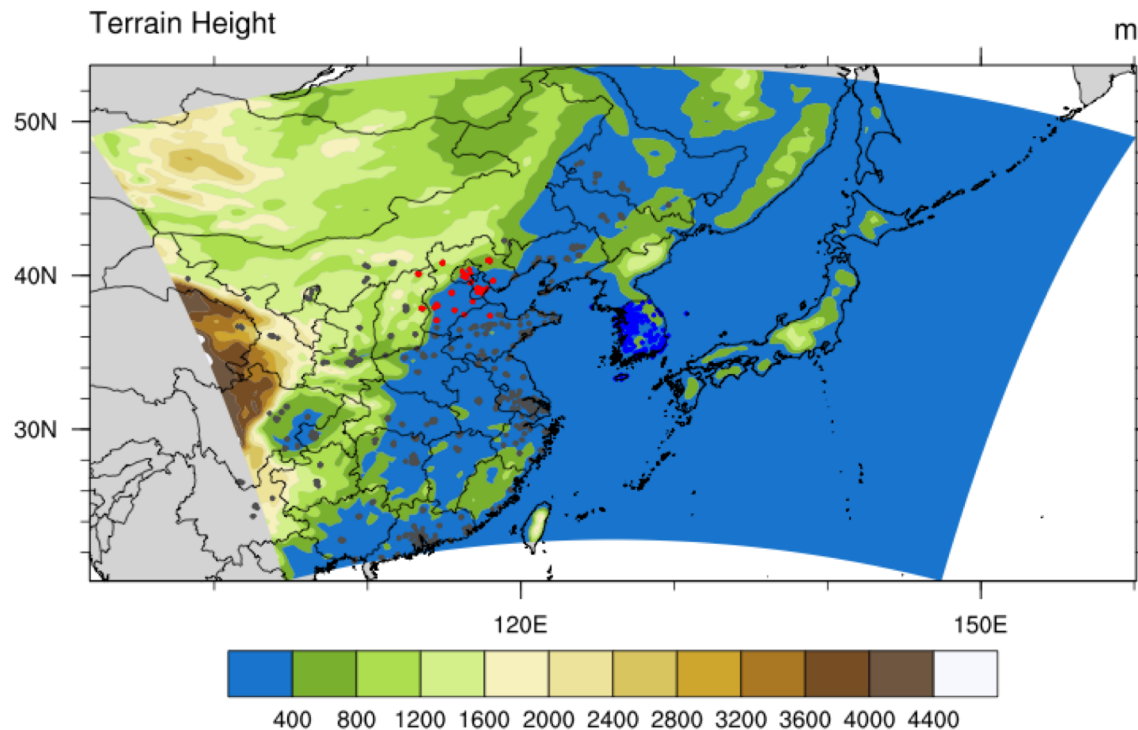


P25



Forecast Verification

- 20160501—20160507
- 6hr cycling, 24hr forecast at 00UTC
- verification region: Polluted region over North China and South Korea

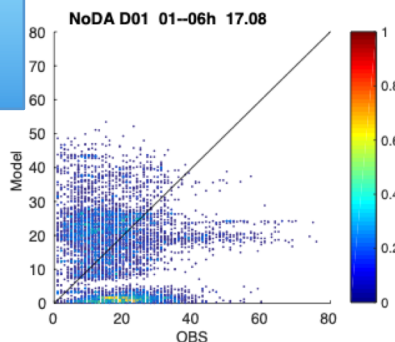


Forecast Verification

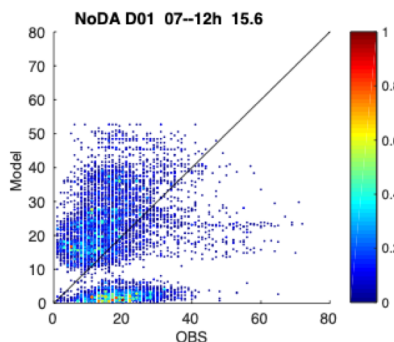
scatters for
01-24h
forecast of
all days

W/O DA

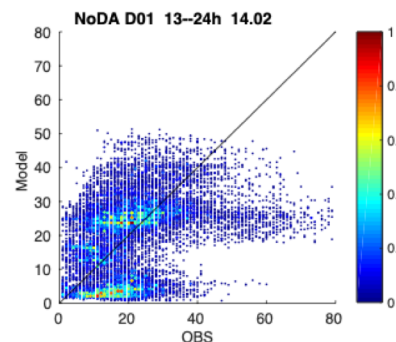
01-06h



07-12h



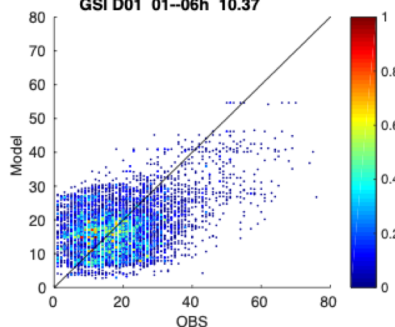
13-24h



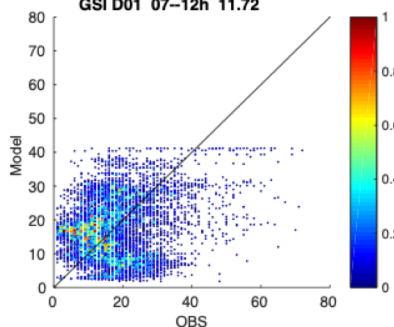
**20160501—
20160507**

GSI

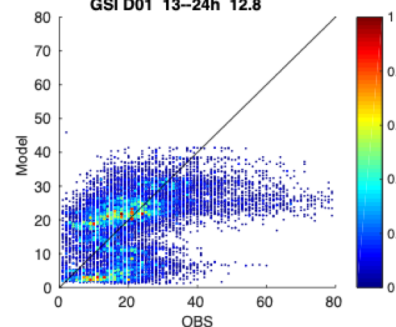
GSI D01 01-06h 10.37



GSI D01 07-12h 11.72

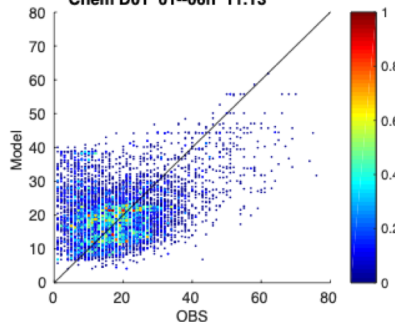


GSI D01 13-24h 12.8

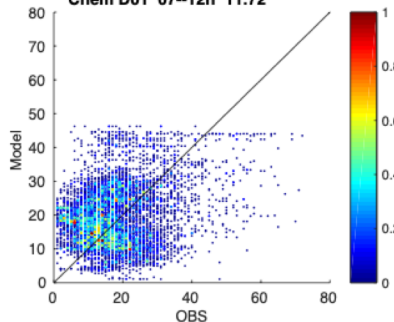


WRFDA

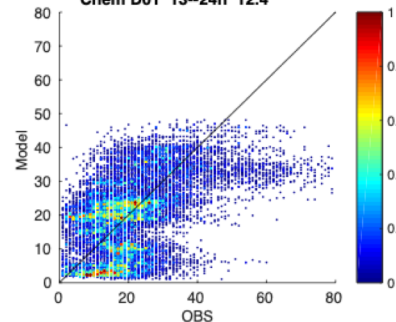
Chem D01 01-06h 11.13



Chem D01 07-12h 11.72



Chem D01 13-24h 12.4



Forecast Verification

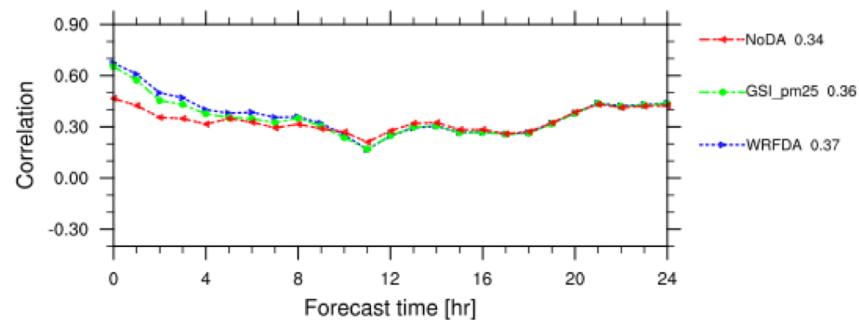
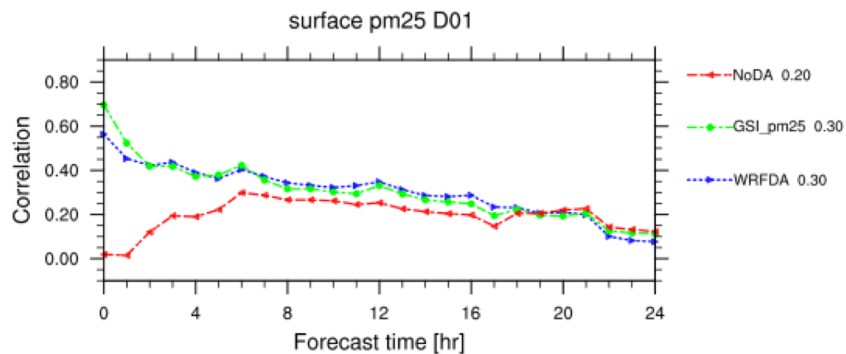
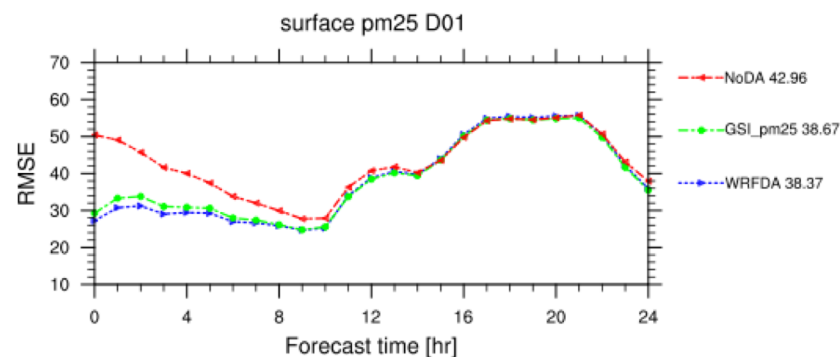
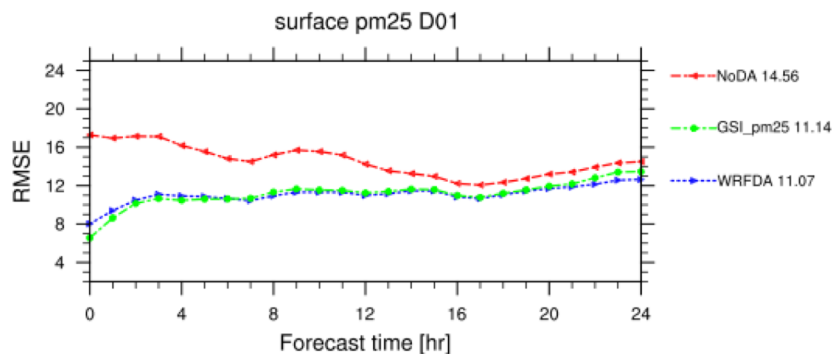
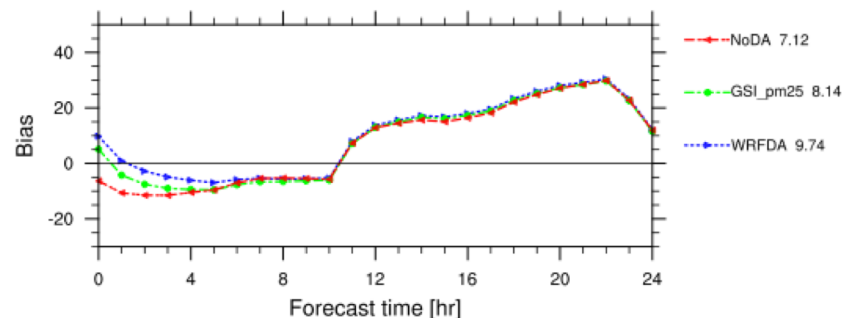
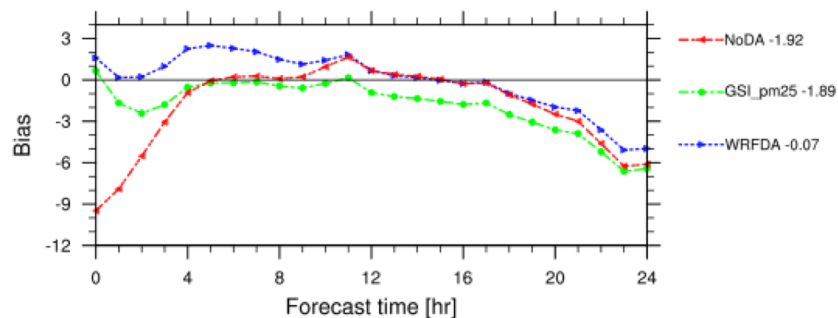
20160501—20160507

Korus (S. Korea)

Korus (N. China)

surface pm25 D01

surface pm25 D01



Forecast Verification

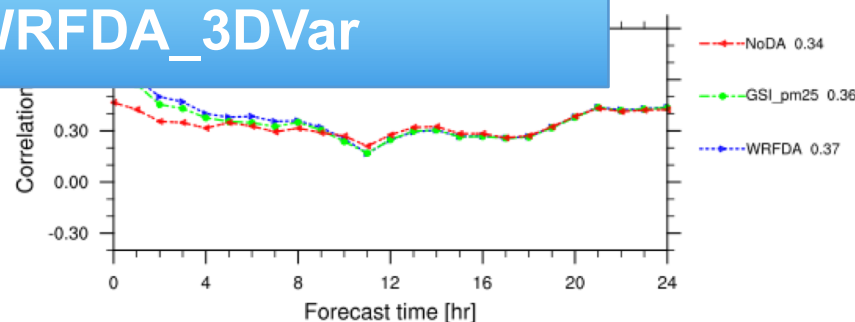
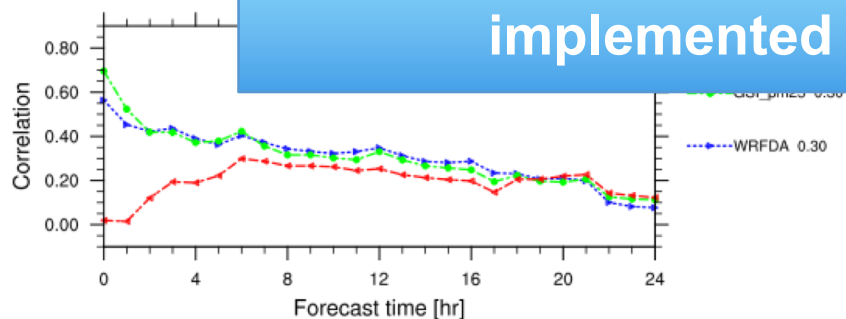
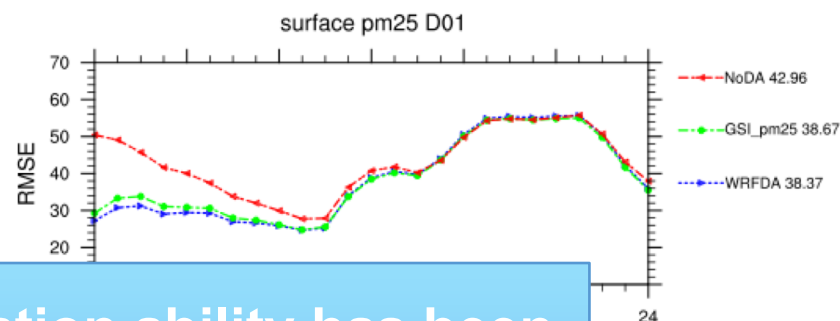
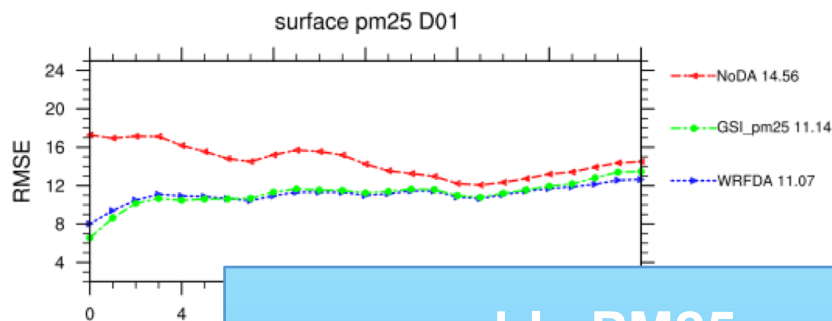
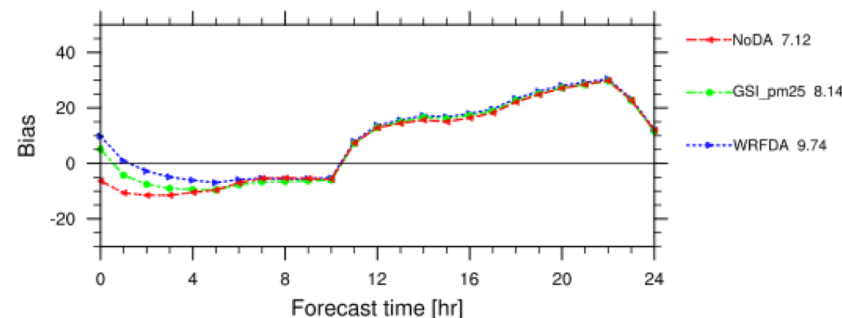
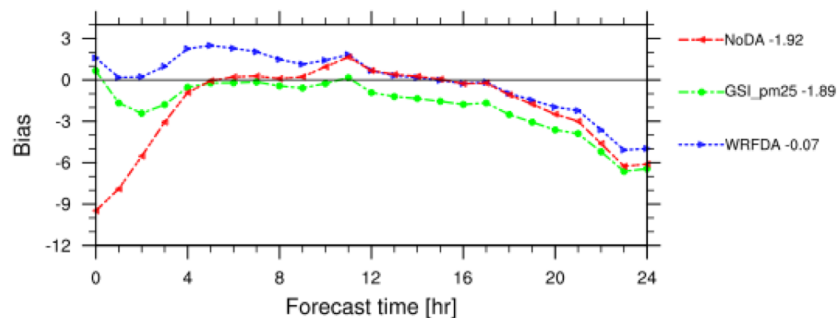
20160501—20160507

Korus (S. Korea)

Korus (N. China)

surface pm25 D01

surface pm25 D01



comparable PM25 assimilation ability has been implemented in WRFDA_3DVar

Chemical/Aerosol DA – Outline

- Background
- PM_{2.5} assimilation with GOCART scheme
- Chemical/Aerosol assimilation with MOSAIC scheme
 - PM₂₅ assimilation
 - PM₂₅ & PM₁₀ assimilation
 - Gaseous pollutant assimilation
- Conclusions

PM_{2.5} DA with MOSAIC

- GENBE_2.0

- analysis variable (univariate):

bc, oc, so₄, no₃, nh₄, cl, na, oin (bins 1-3)

easily switch between different aerosol schemes

- MOSAIC Scheme

- observation operator:

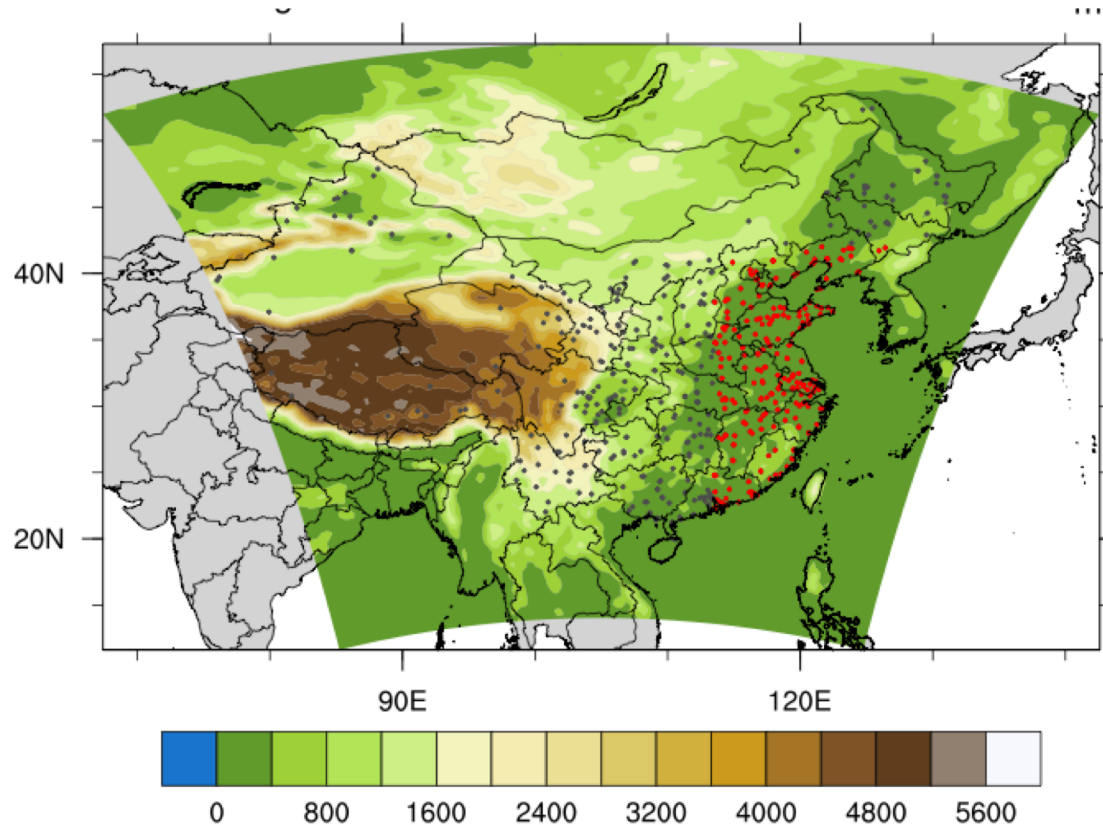
$$PM_{2.5} = \rho \sum_{i=1}^3 bc_i + oc_i + so_{4i} + no_{3i} + nh_{4i} + cl_i + na_i + oin_i$$

- observation error:

same as GOCART scheme

DA experiment

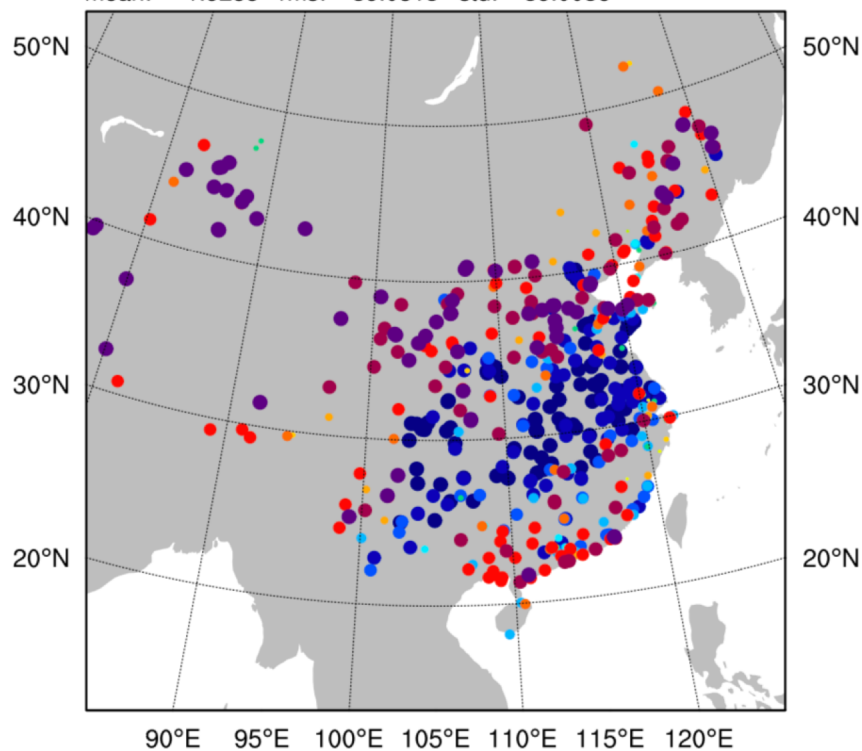
- 20150102—20150110
- 6hr cycling, 24hr forecast at 00UTC
- observation: PM_{2.5} surface concentrations over China



DA experiment

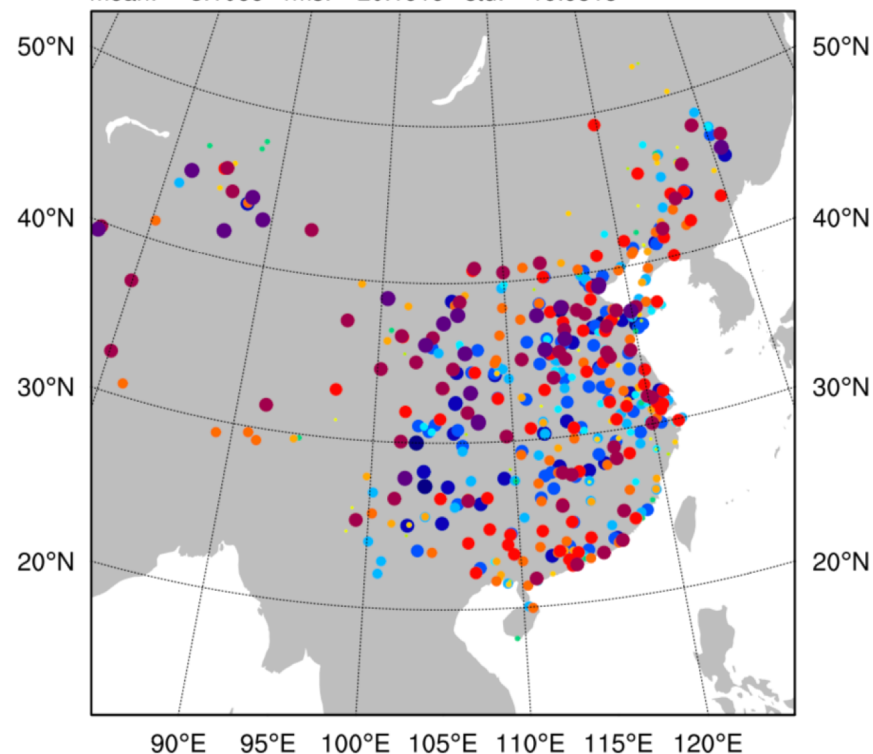
OMB CHEM PM25 (Used: 504)

mean: -1.9288 rms: 39.0513 std: 39.0036



OMA CHEM PM25 (Used: 504)

mean: 3.1066 rms: 20.1919 std: 19.9515



● $x < -40$
● $-10 \leq x < -5$
● $-1 \leq x < 0$
● $3 \leq x < 5$
● $20 \leq x < 40$
● $-40 \leq x < -20$
● $-5 \leq x < -3$
● $0 \leq x < 1$
● $5 \leq x < 10$
● $x \geq 40$
● $-20 \leq x < -10$
● $-3 \leq x < -1$
● $1 \leq x < 3$
● $10 \leq x < 20$

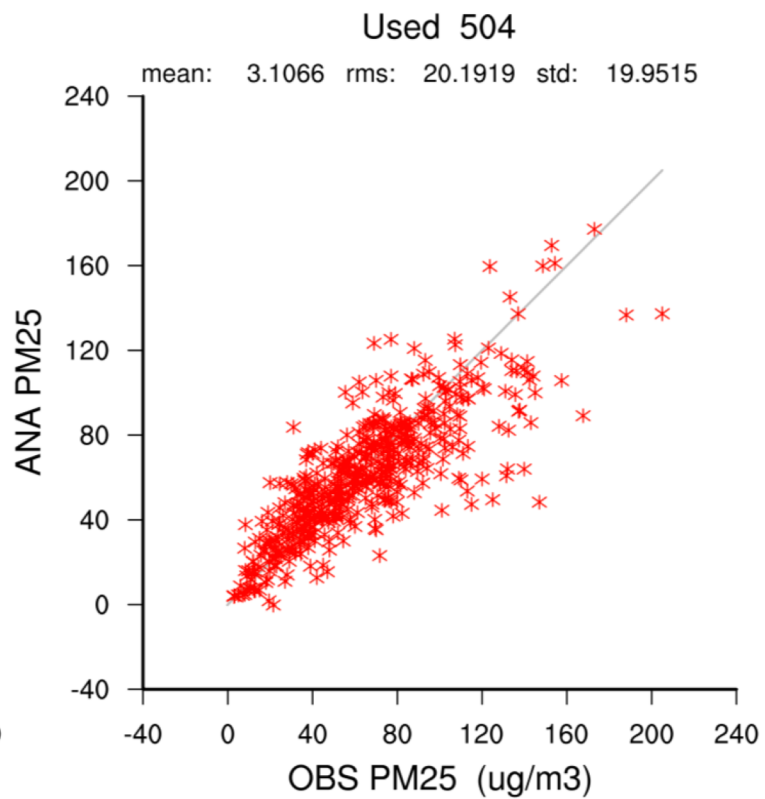
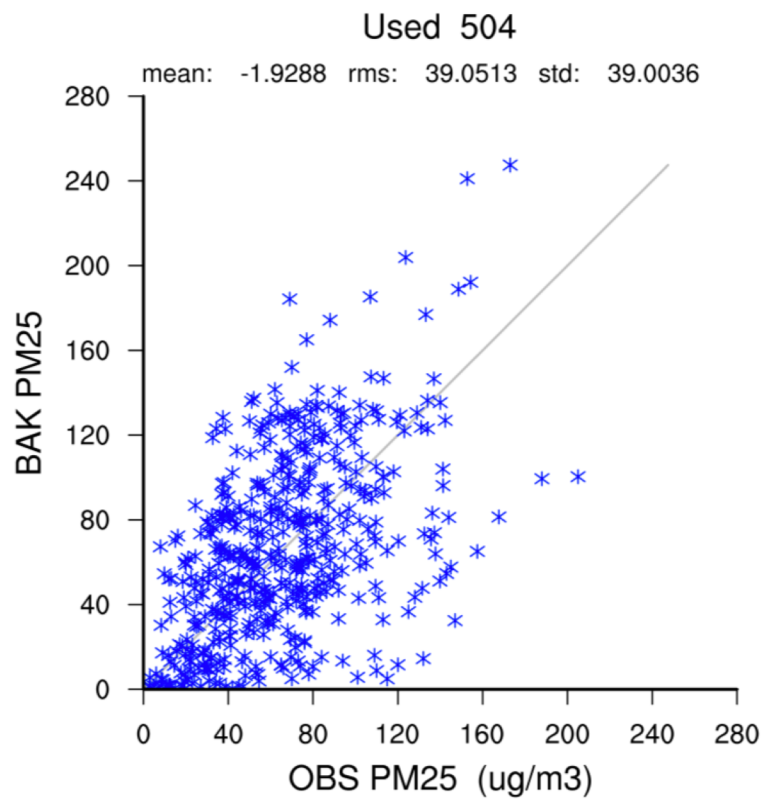
OMB

2015010200 UTC

OMA

DA experiment

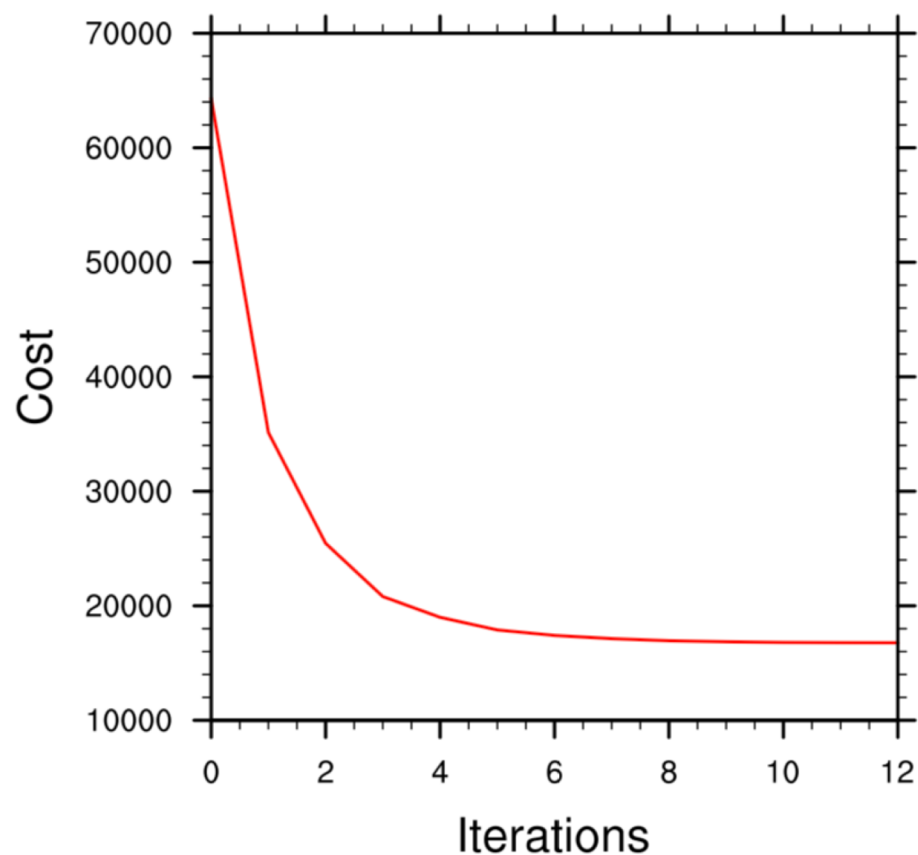
2015010200 CHEM 531 / 504



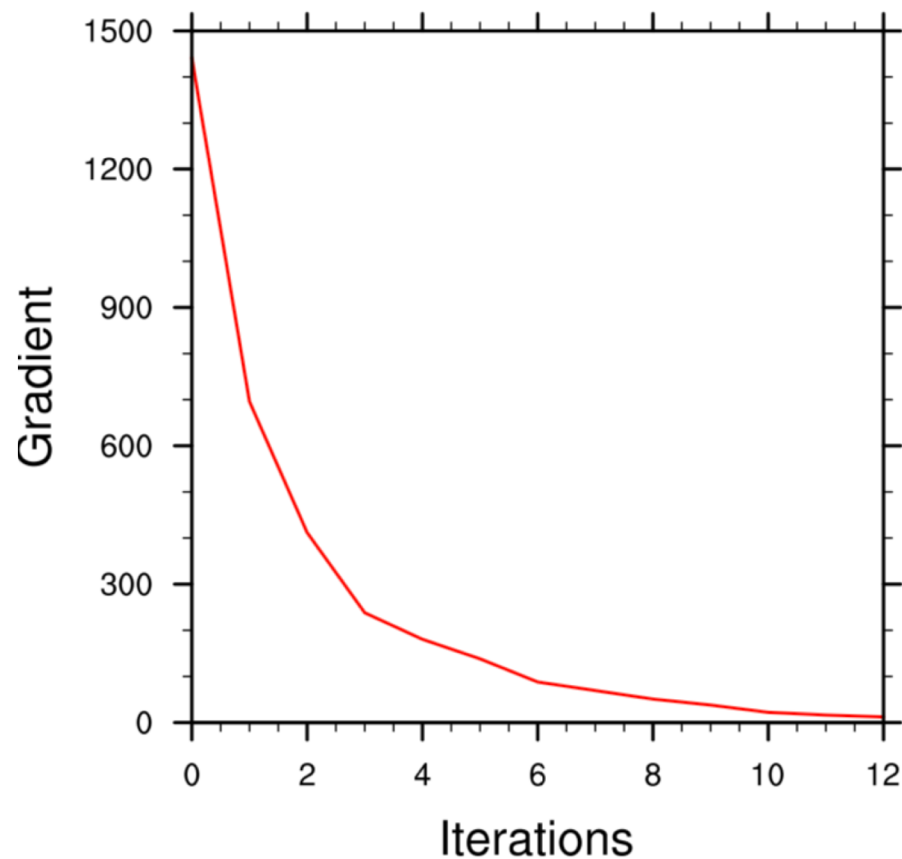
DA experiment

2015010200 UTC

Cost function minimization for



Gradient function for



DA experiment

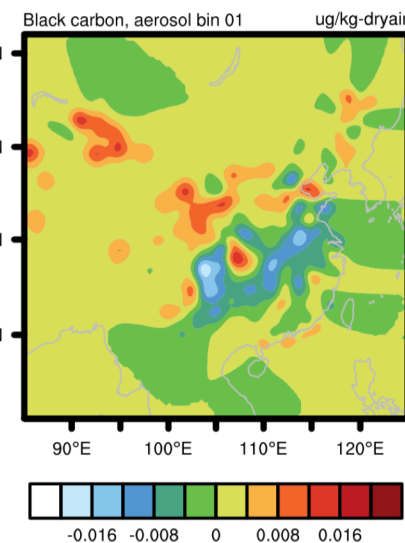
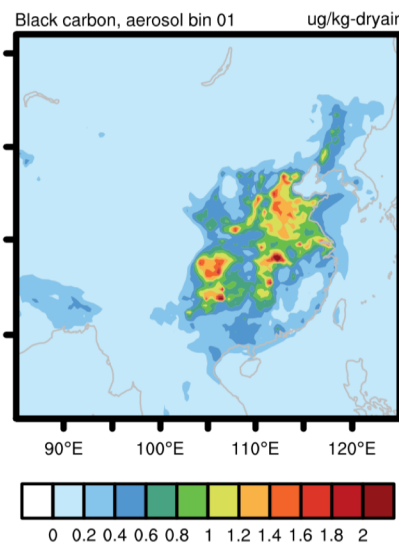
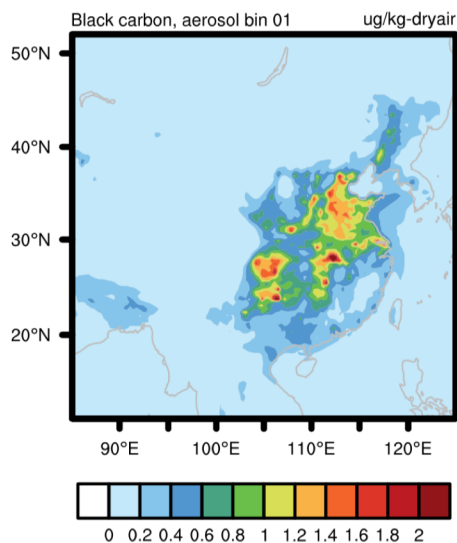
2015010200 UTC

W/O DA

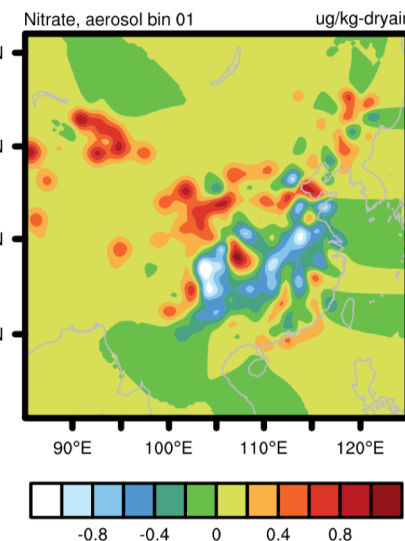
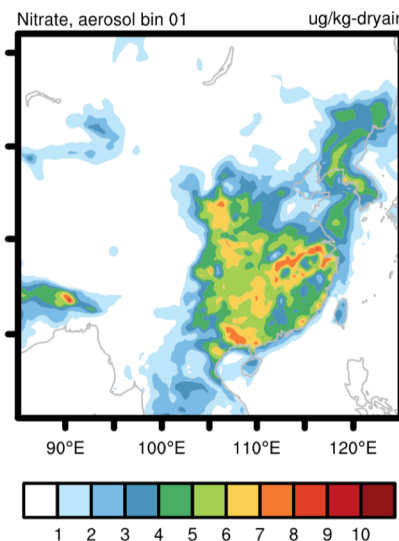
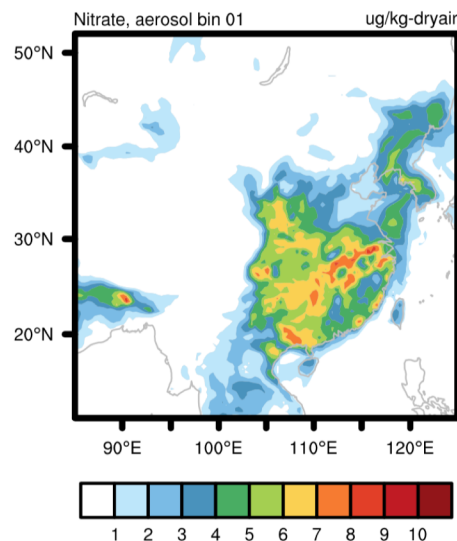
WRFDA

INCRE

BC_1



NO3_1



DA experiment

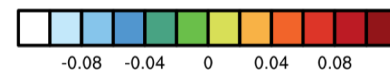
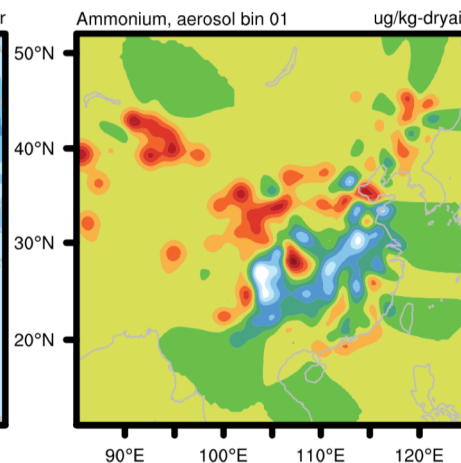
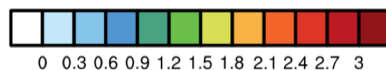
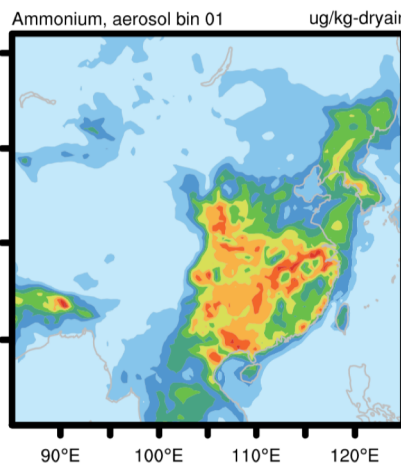
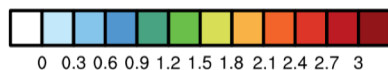
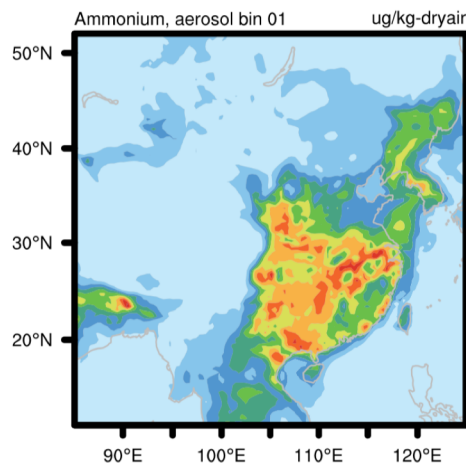
2015010200 UTC

W/O DA

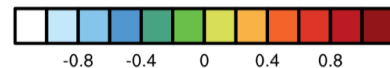
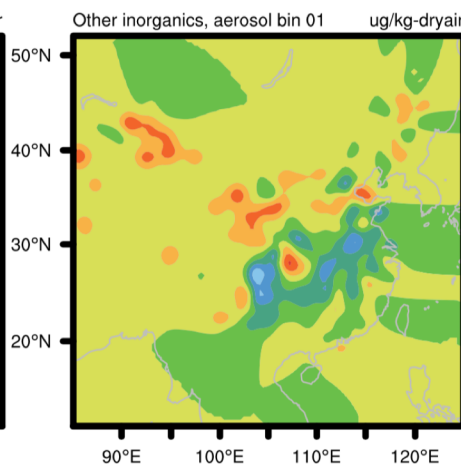
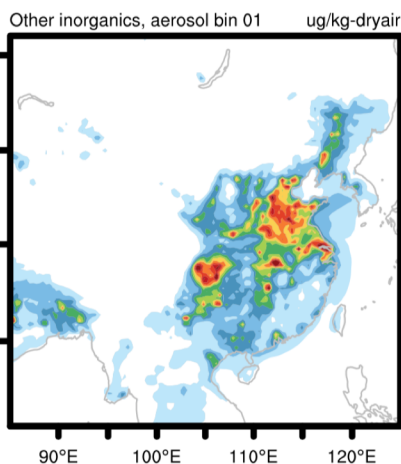
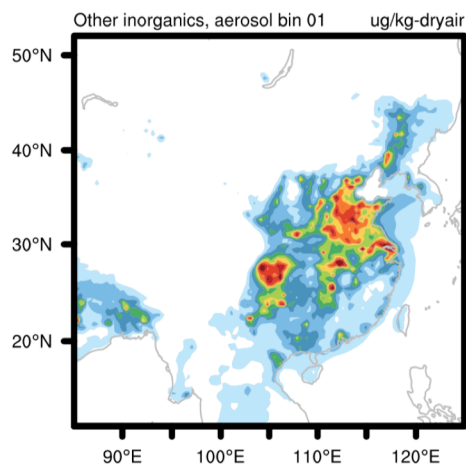
WRFDA

INCRE

NH4₁



OIN₁



Forecast verification

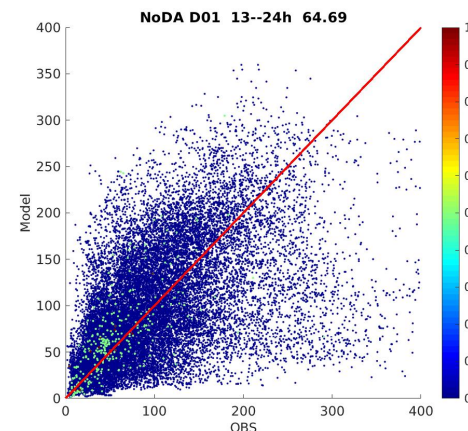
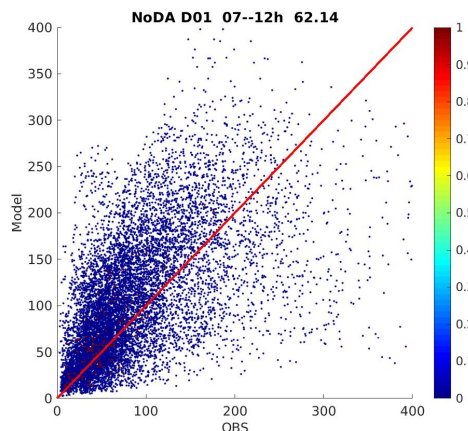
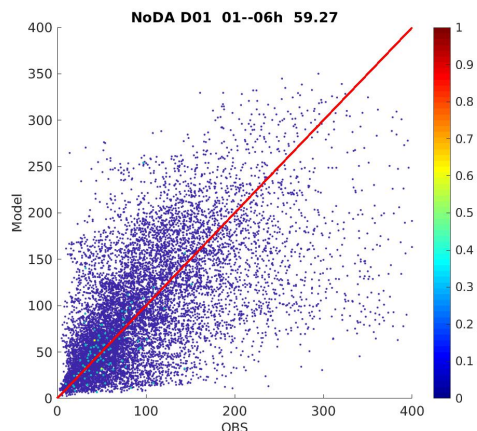
20150102—
20150110

01-06h

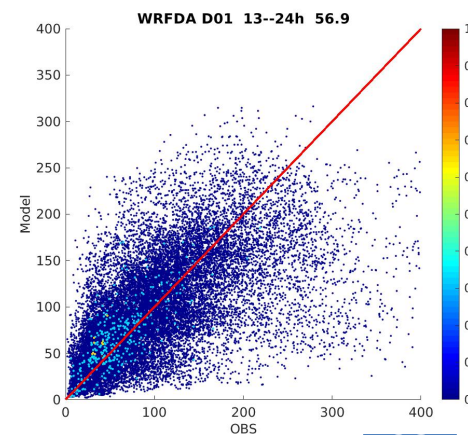
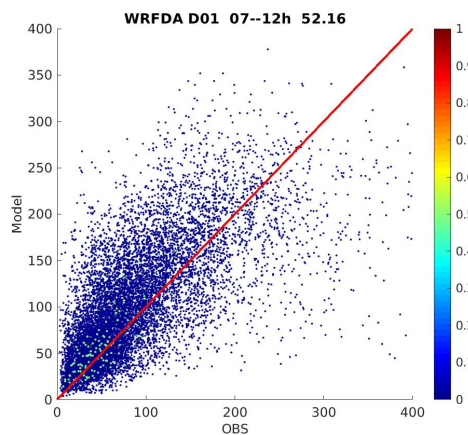
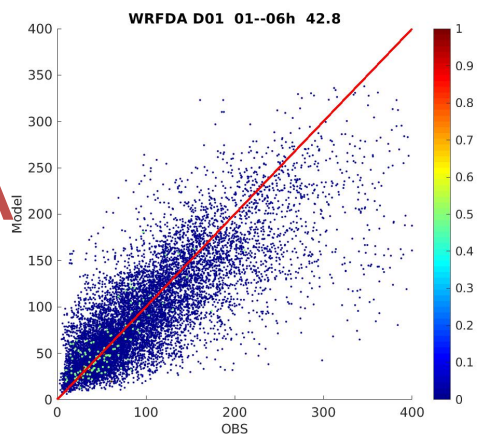
07-12h

13-24h

W/O DA



WRFDA



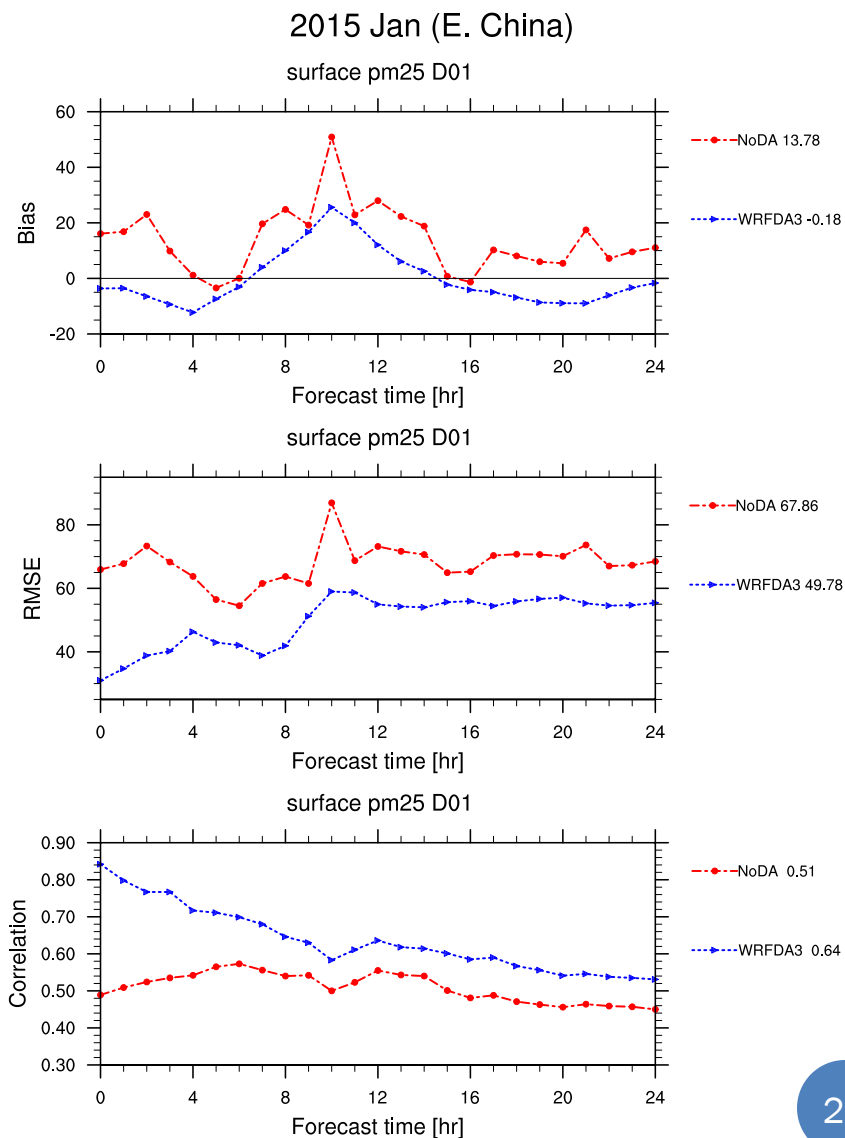
DA experiment

20150102—20150110

WRFDA works well with
MOSAIC scheme
Developed Chemical DA
system can easily switch
between different aerosol
schemes

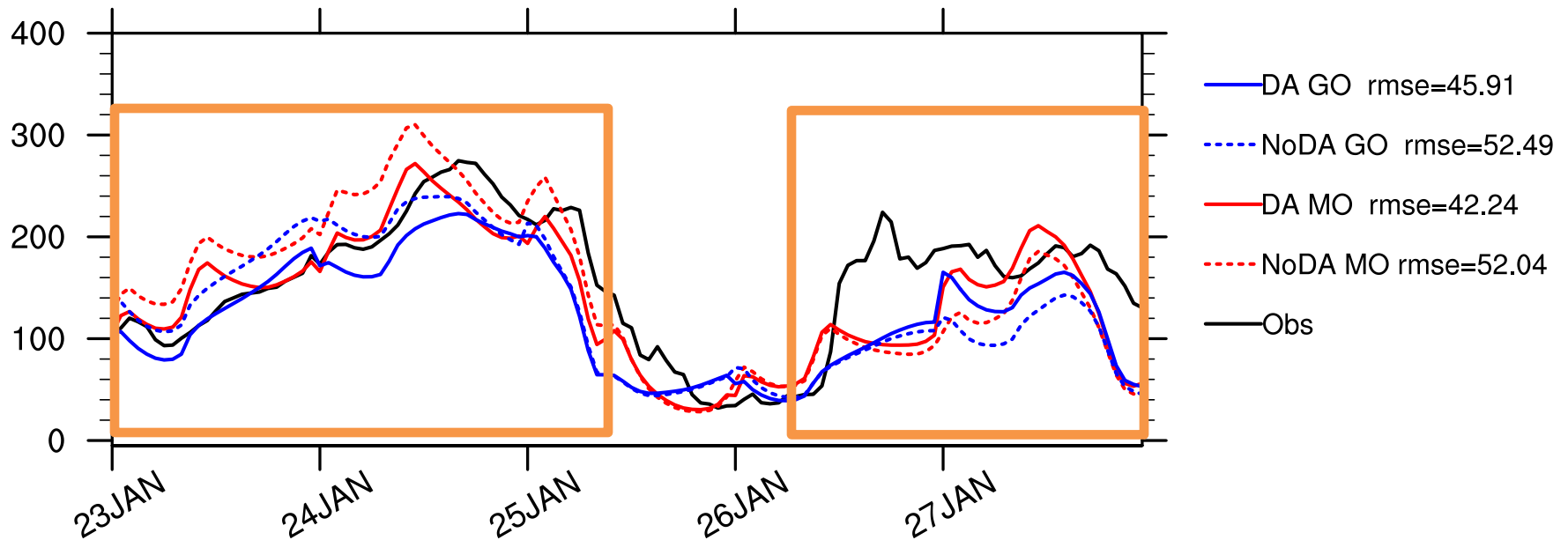
26.6%

20.3%



PM25 forecast in GOCART and MOSAIC

N. China PM25



Heavy Polluted Event on Jan 2017

PM_{2.5} & PM₁₀ DA with MOSAIC

- MOSAIC Scheme

- observation operator:

$$PM_{2.5} = \rho \sum_{i=1}^3 bc_i + oc_i + so_{4i} + no_{3i} + nh_{4i} + cl_i + na_i + oin_i$$

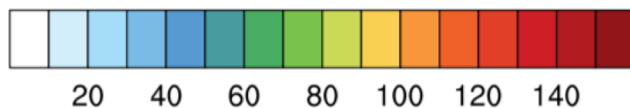
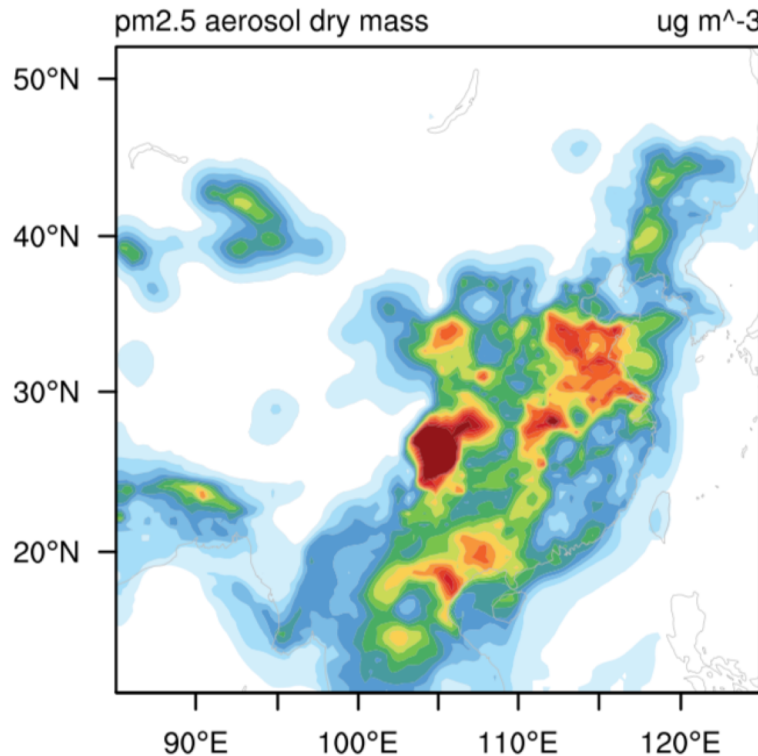
$$PM_{10} = \rho \sum_{i=1}^4 bc_i + oc_i + so_{4i} + no_{3i} + nh_{4i} + cl_i + na_i + oin_i$$

**(PM₁₀-PM₂₅) is used to control the 4th bin of the
8 type of species**

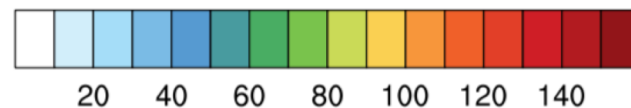
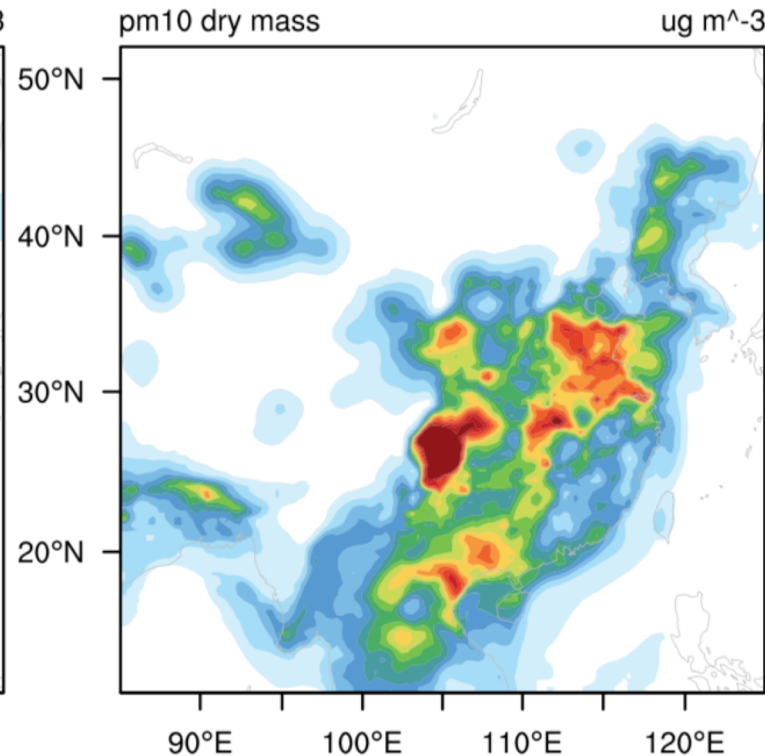
Peng, Z., Lei, L., Liu, Z., Sun, J., Ding, A., Ban, J., ... & Chu, K. (2018). The impact of multi-species surface chemical observation assimilation on air quality forecasts in China. *Atmospheric Chemistry and Physics*, 18(23), 17387-17404.

PM2.5 & PM10 in WRF_Chem

2015010200 UTC



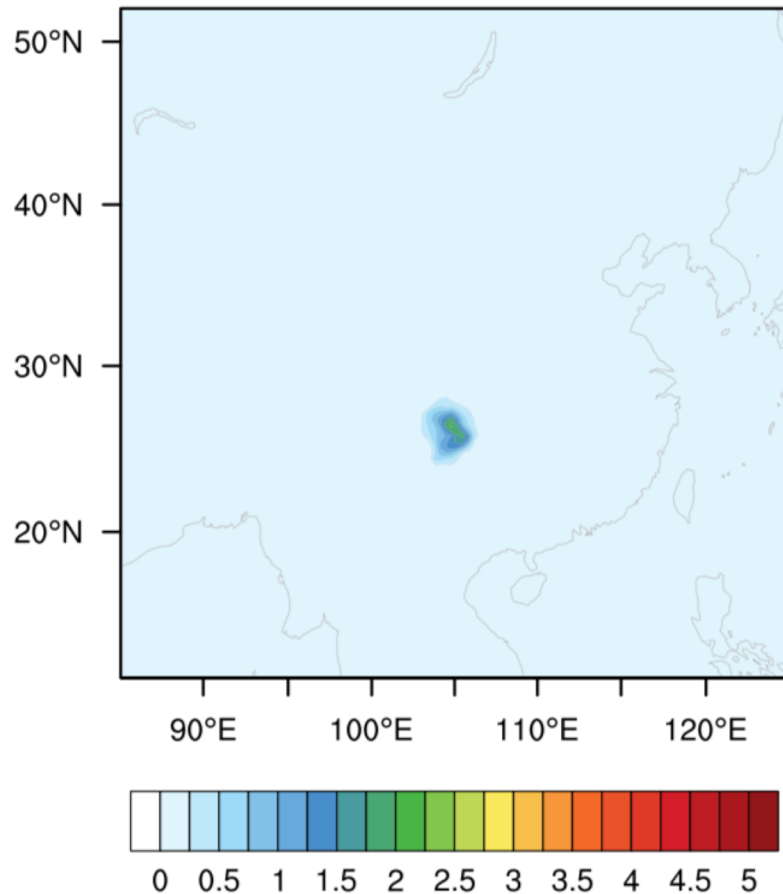
PM25



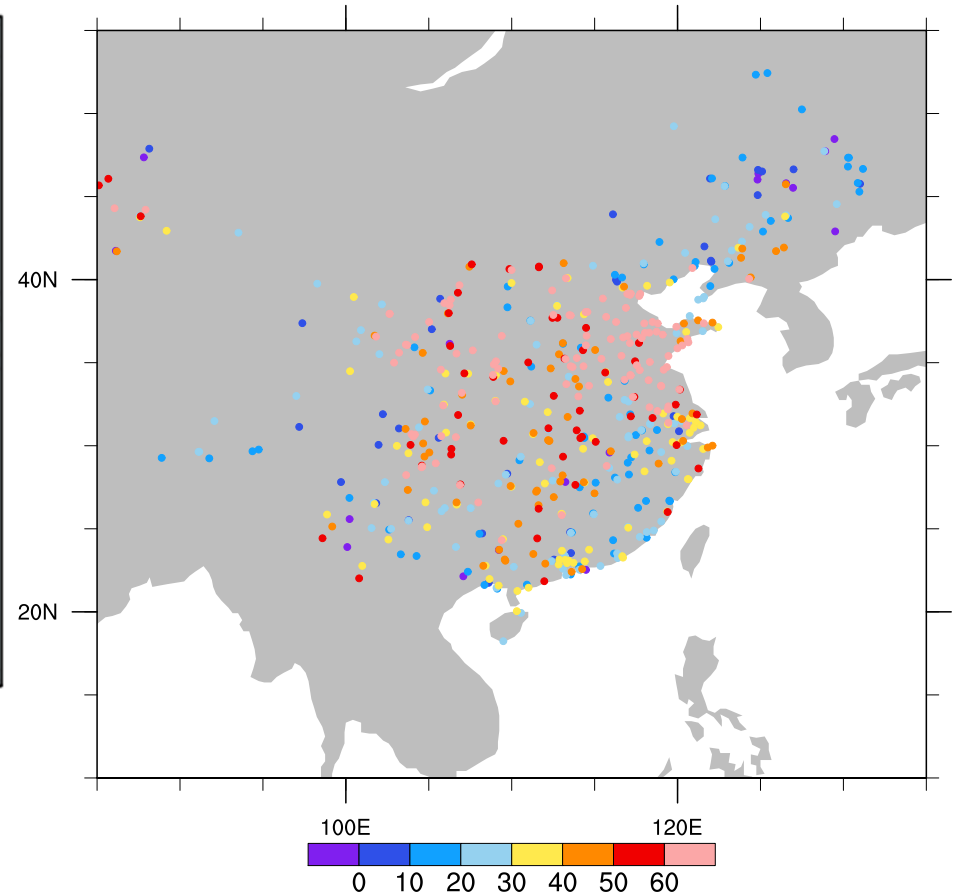
PM10

PM_{2.5} & PM₁₀ in WRF_Chem

2015010200 UTC



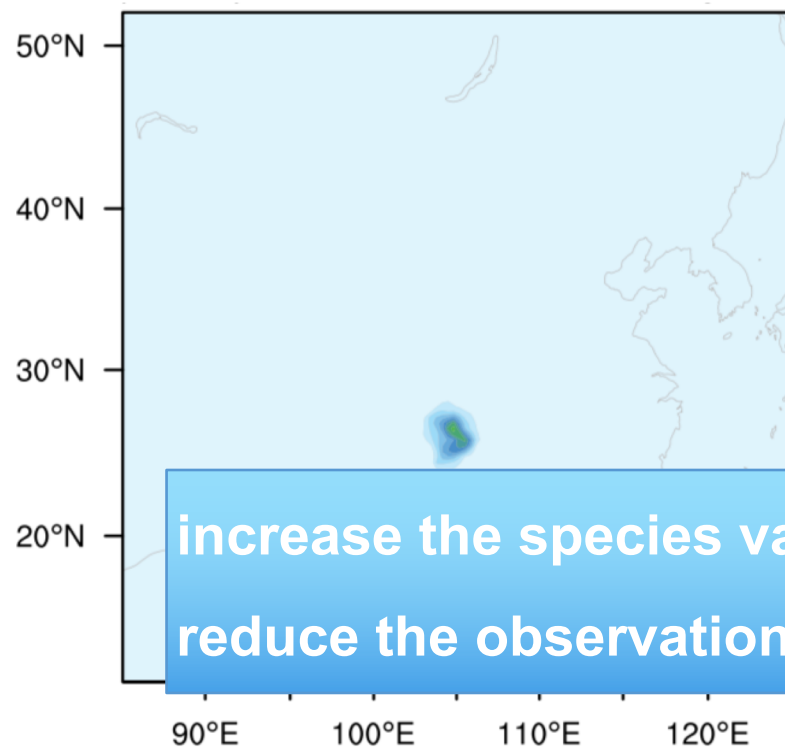
PM₁₀-PM₂₅ WRF



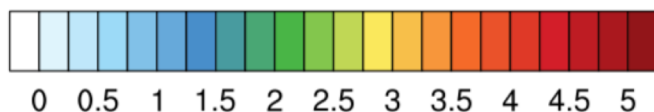
PM₁₀-PM₂₅ OBS

PM2.5 & PM10 in WRF_Chem

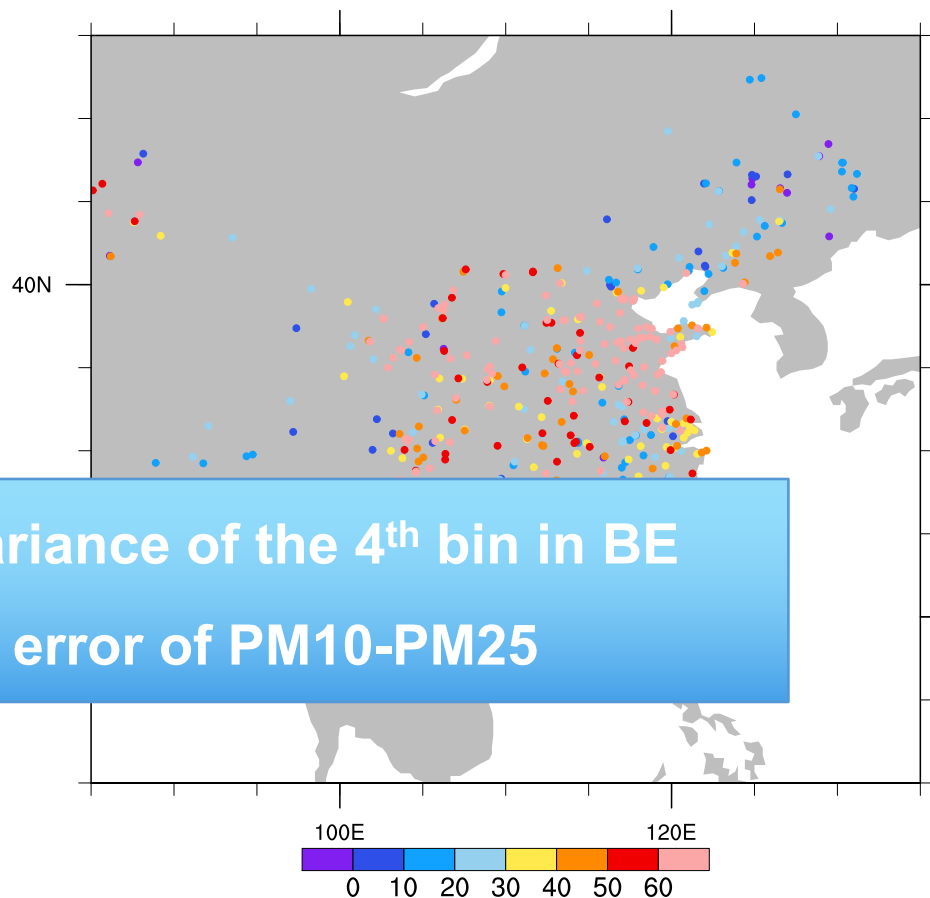
2015010200 UTC



increase the species variance of the 4th bin in BE
reduce the observation error of PM10-PM25



PM10-PM25 WRF

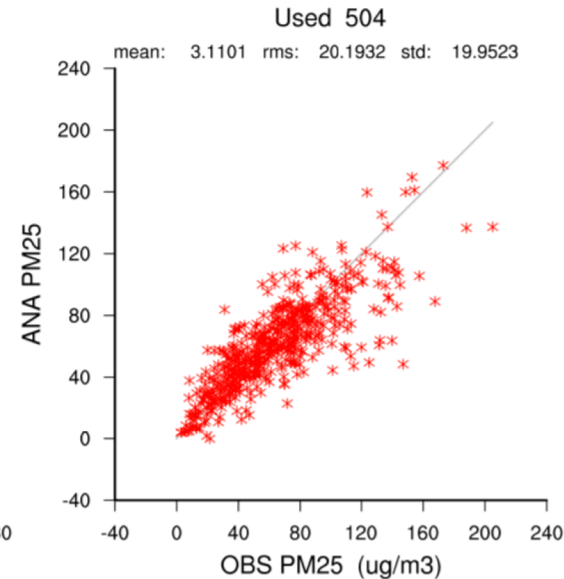
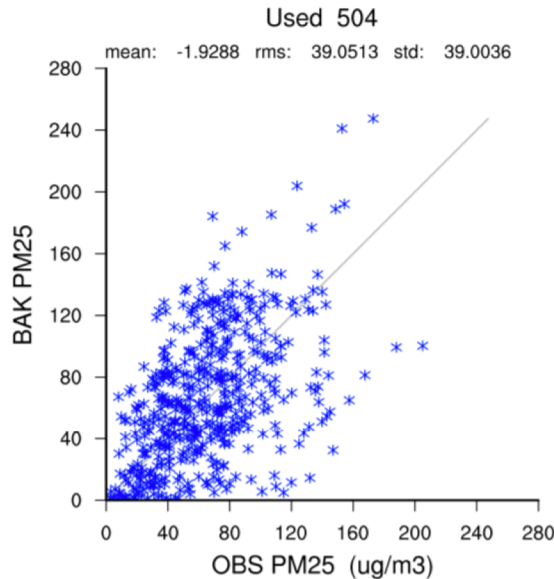


PM10-PM25 OBS

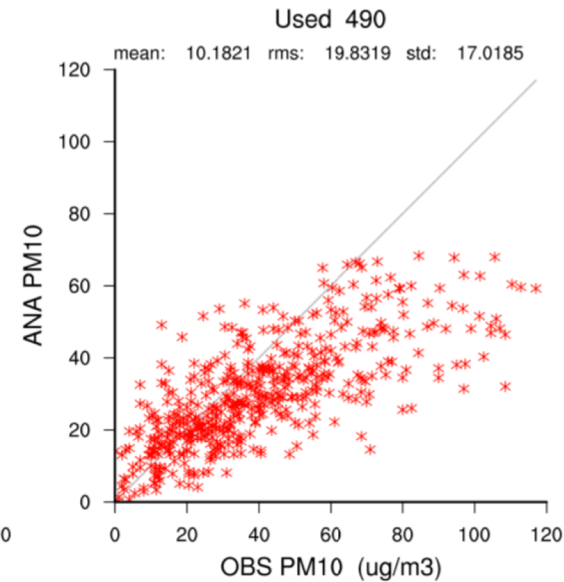
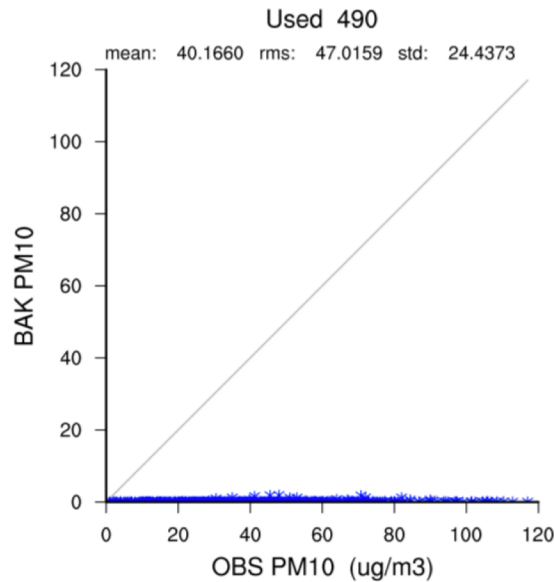
PM2.5 & PM10 DA with MOSAIC

2015010200 CHEM 531 / 504

PM25



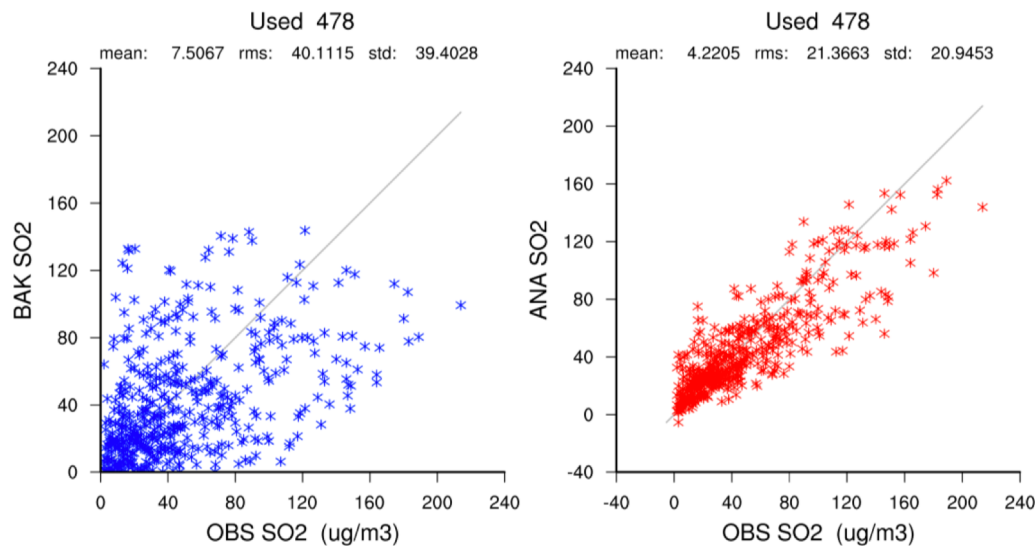
PM10-PM25



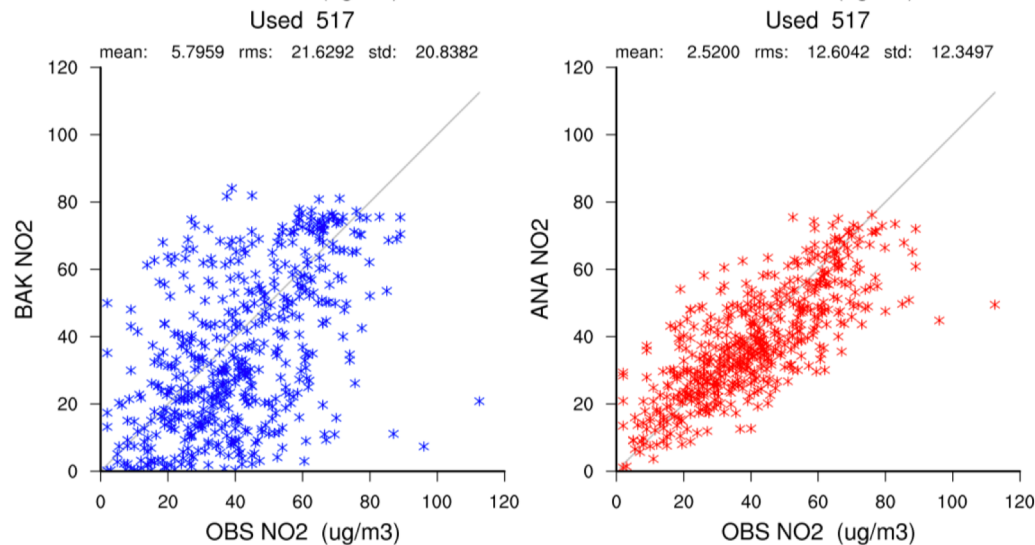
Gaseous Pollutant DA with MOSAIC

SO₂

2015010200 CHEM 531 / 478



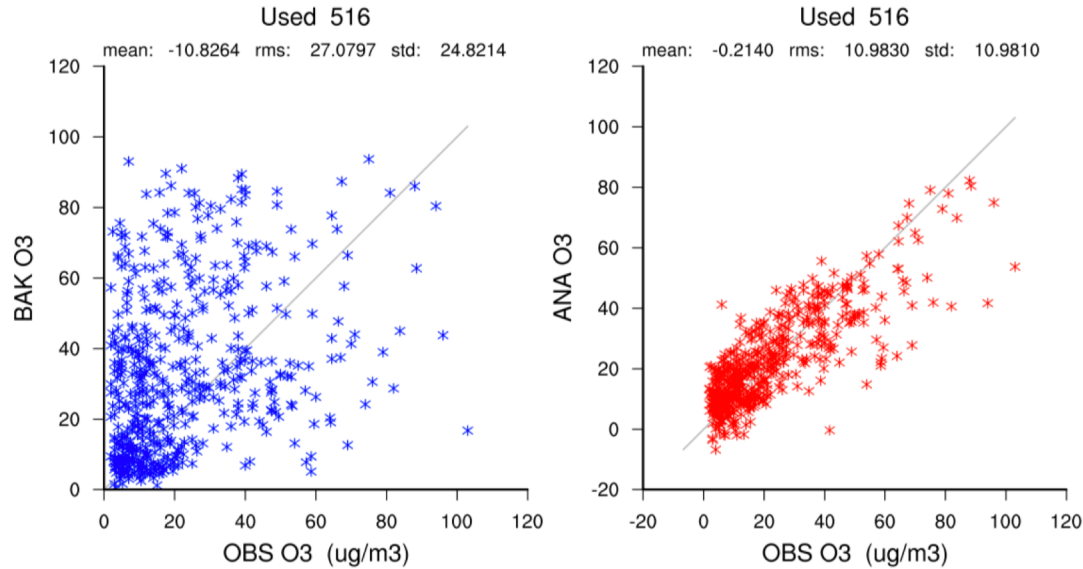
NO₂



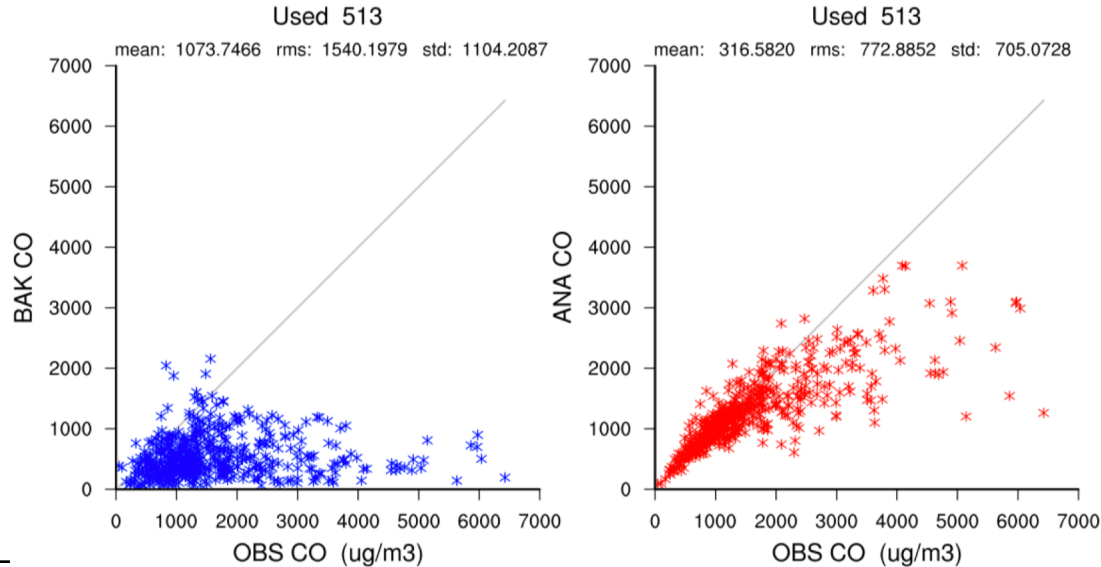
Gaseous Pollutant DA with MOSAIC

O₃

2015010200 CHEM 531 / 478



CO



Conclusions and future works

- GENBE is developed to generate chemical statistics
- Chemical/ Aerosol assimilation ability has been implemented in WRFDA-3DVar (PM2.5, PM10, SO2, NO2, O3, CO)
- Chemical/ Aerosol DA system is designed with a flexible switch capability for different aerosol schemes
- Detailed analysis and further tuning
- Other chemical observation assimilation (satellite AOD)