



# Does Temperature Nudging Overwhelm Aerosol Radiative Effects in Regional Integrated Climate Models?

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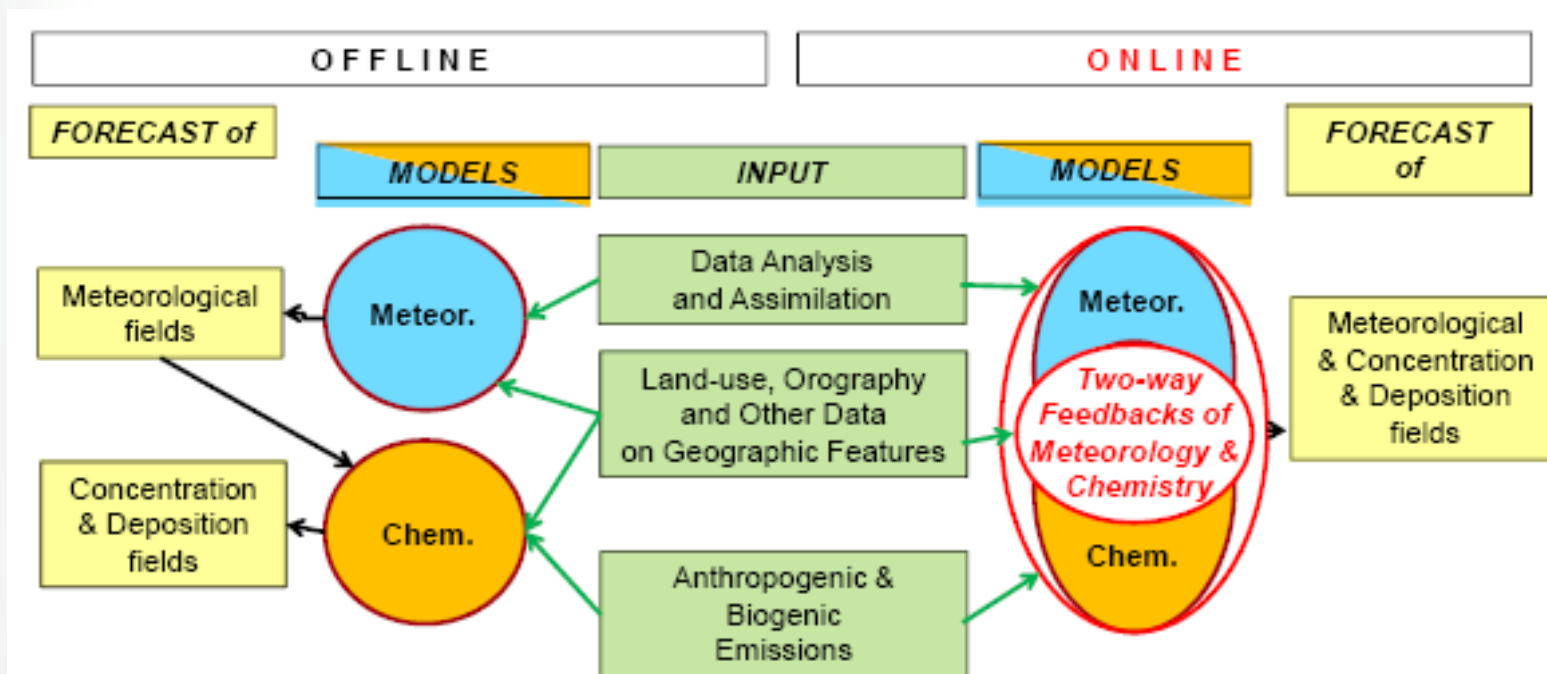
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- ❑ Meteorology is an important driver for chemical transport models.

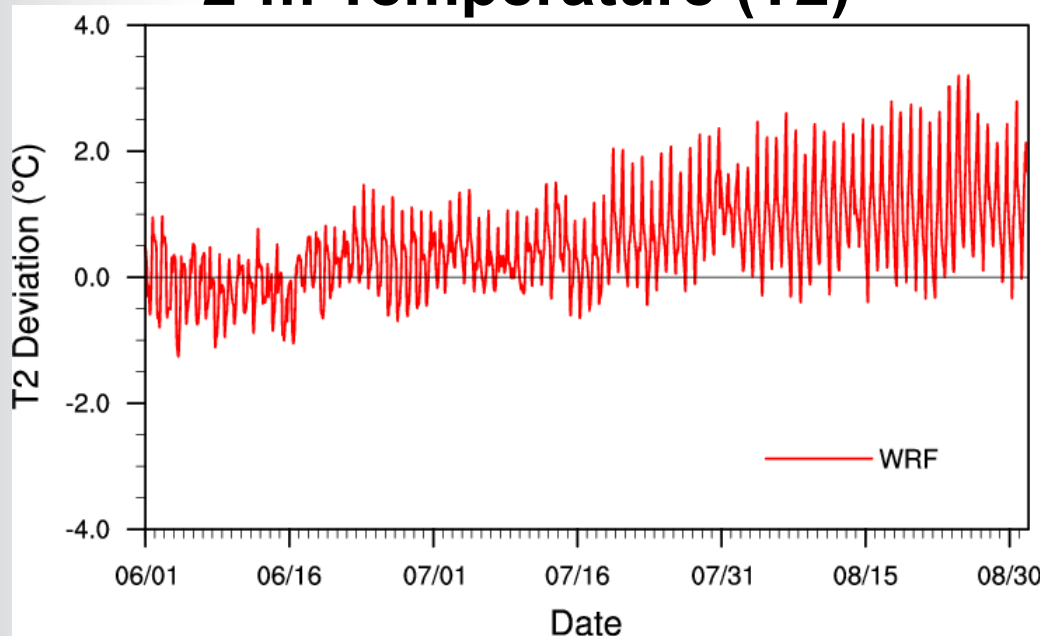


Schematic diagram of (left) offline and (right) online coupled meteorology and chemistry modelling approaches for air quality and meteorology simulation and forecasting (Baklanov et al., 2014).



# Meteorological Biases

## 2-m Temperature (T2)



### □ Two Approaches

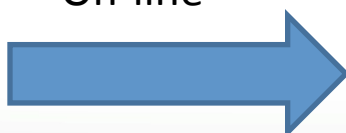
#### 1) Frequent reinitialization

- Discontinuity
- Suppress aerosol effects

#### 2) Data assimilation (i.e., nudging)

- Suppress aerosol effects

On-line



$\Delta T \uparrow N$  vs.  $\Delta T \uparrow AE$  ?



# Pseudo Radiative Effects (PRE)

## 1. Surface Effects

Flux-Adjusting Surface Data Assimilation System  
(FASDAS, Alapaty et al., 2008)

$$\begin{aligned}
 H\downarrow s\uparrow F &= \rho C\downarrow p (\partial T\downarrow a\uparrow F / \partial t) \Delta z \quad H\downarrow l\uparrow F \\
 &= \rho L (\partial q\downarrow a\uparrow F / \partial t) \Delta z \\
 PRE_{sfc} &= \{H\downarrow s\uparrow F - \psi\downarrow q H\downarrow l\uparrow F\}\downarrow sfc
 \end{aligned}$$

☐ PRE > 0: Nudging has **warming** effects (i.e., model underpredicts temperatures)

## 2. Tropospheric Effects

Four-Dimensional Data Assimilation  
(FDDA, Stauffer and Seaman, 1990, 1994)

$$PRE_{atm} = 1/n \sum pbl\uparrow top H\downarrow s\uparrow F$$

☐ PRE < 0: Nudging has **cooling** effects (i.e., model overpredicts temperatures)

## 3. TOA Effects (Effects 1 + 2)

$$PRE_{toa} = PRE_{sfc} + PRE_{atm}$$



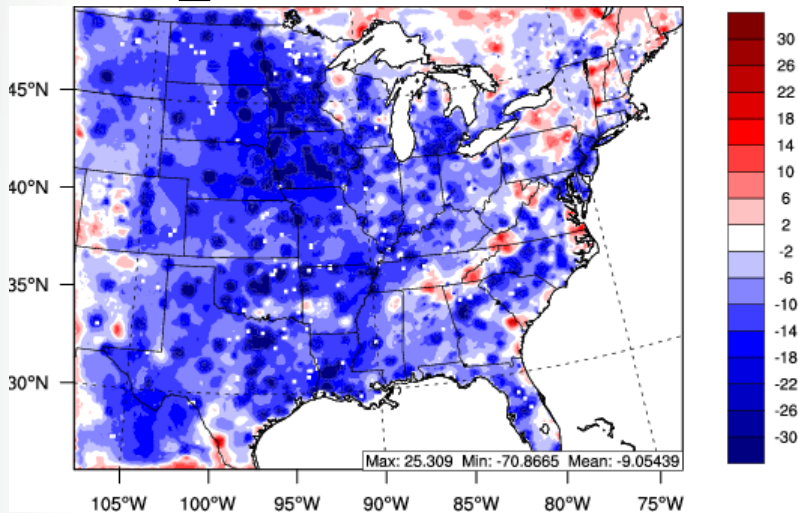
# Model Configurations

- ❑ *Weather Research and Forecasting (WRF) Model*
  - **WRF3.7.1**
  - **YSU, NOAH, MSKF, RRTMG, Morrison DMS**
  - **Mild analysis nudging of free atmosphere (u-v wind components and temperature :  $5.0 \times 10^{-5} \text{ s}^{-1}$ ; moisture:  $5.0 \times 10^{-6} \text{ s}^{-1}$ )**
  - **FASDAS for surface layer (temperature and moisture:  $8.3 \times 10^{-4} \text{ s}^{-1}$ , see Alapaty's talk)**
  - **DX = 12 km grids; 35 layers up to 50hPa**
  - **12 km NCEP NAM, central and eastern U.S.**
  - **June, July, and August (JJA) 2006**

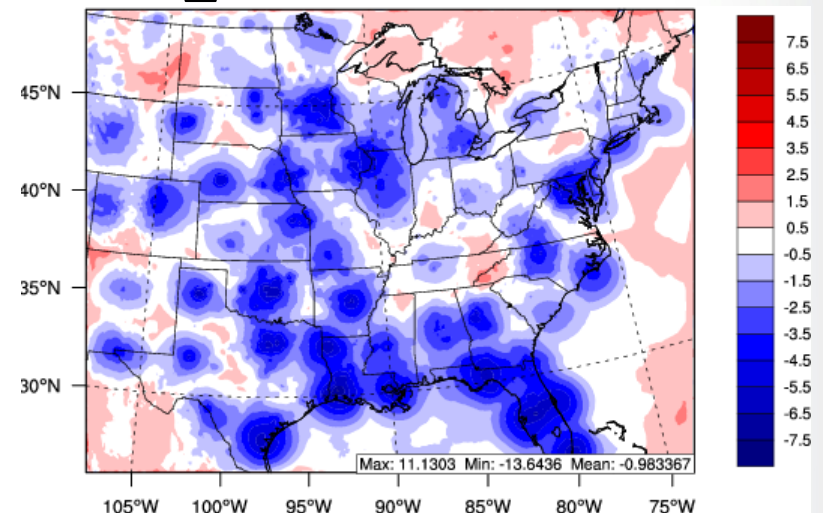


# PRE (JJA Averages)

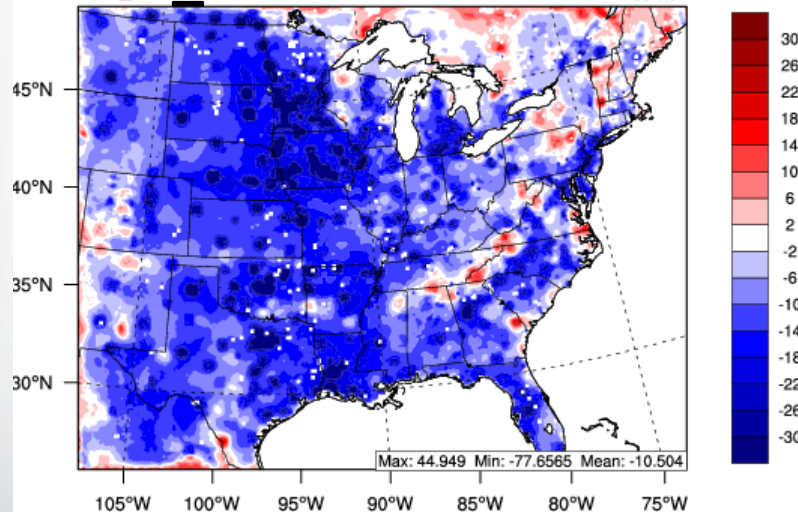
**PRE\_sfc** Mean=  $-9.1 \text{ W m}^{-2}$



**PRE\_atm** Mean=  $-1.0 \text{ W m}^{-2}$



**PRE\_toa** Mean=  $-10.5 \text{ W m}^{-2}$



- PRE\_toa is dominated by PRE\_sfc.
- Nudging is cooling the surface and atmosphere.





# Aerosol Radiative Effects (ARE)

## SW Direct Radiative Effects (DRE)

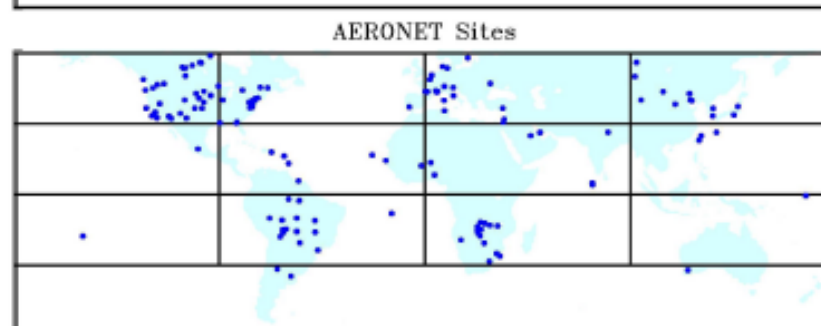
MISR_G											
MAM	JJA	ANN	MAM	JJA	ANN	MAM	JJA	ANN	MAM	JJA	ANN
0.18	0.15	0.14	0.22	0.22	0.17	0.25	0.24	0.21	0.31	0.24	0.22
-5.7	-5.7	-4.2	-7.0	-6.7	-5.0	-5.0	-5.0	-4.4	-5.4	-5.4	-4.4
0.20	0.19	0.15	0.35	0.43	0.32	0.37	0.45	0.33	0.37	0.32	0.31
-5.7	-7.0	-5.1	-6.9	-9.1	-6.9	-6.4	-7.0	-5.6	-8.0	-9.4	-7.2
			0.13	0.10	0.17	0.14	0.24	0.23	0.11	0.10	0.14
			-3.9	-3.0	-4.3	-4.1	-4.6	-5.1	-3.3	-3.1	-3.8
MAM			JJA	ANN		Global Average					
0.06			0.07	0.09		0.25			0.25		
-4.1			-3.0	-5.8		-5.1			-5.8		

MO_MLGO											
MAM	JJA	ANN	MAM	JJA	ANN	MAM	JJA	ANN	MAM	JJA	ANN
0.17	0.14	0.13	0.20	0.21	0.17	0.24	0.23	0.20	0.29	0.23	0.21
-5.2	-5.0	-3.9	-6.3	-7.4	-5.3	-5.4	-5.8	-4.5	-5.4	-6.4	-4.4
0.19	0.16	0.15	0.31	0.36	0.29	0.34	0.36	0.30	0.33	0.23	0.25
-5.5	-6.3	-4.7	-6.2	-7.4	-6.1	-5.6	-6.2	-5.1	-7.0	-6.5	-6.0
			0.10	0.11	0.13	0.11	0.23	0.19	0.08	0.08	0.11
			-3.0	-2.9	-3.3	-3.2	-4.5	-4.2	-2.5	-2.5	-2.9
MAM			JJA	ANN		Global Average					
0.07			0.07	0.09		0.21			0.21		
-3.3			-2.8	-4.8		-4.7			-5.3		

GOCART											
MAM	JJA	ANN	MAM	JJA	ANN	MAM	JJA	ANN	MAM	JJA	ANN
0.14	0.11	0.11	0.19	0.19	0.17	0.30	0.25	0.23	0.28	0.23	0.22
-4.3	-4.0	-3.6	-5.8	-5.9	-4.9	-7.0	-6.3	-5.3	-5.1	-5.8	-4.4
0.15	0.13	0.11	0.29	0.34	0.28	0.33	0.34	0.28	0.34	0.18	0.25
-3.3	-4.5	-3.2	-5.1	-6.6	-5.5	-4.7	-4.9	-4.3	-6.6	-5.0	-5.6
			0.08	0.15	0.12	0.07	0.26	0.17	0.06	0.06	0.07
			-2.3	-3.1	-2.6	-2.0	-4.2	-3.0	-1.6	-1.7	-1.7
MAM			JJA	ANN		Global Average					
0.07			0.08	0.08		0.22			0.22		
-3.6			-3.1	-4.0		-4.4			-4.8		

AOT (upper) and SSA (lower)											
DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON
0.05/0.11/0.15/0.08	0.09/0.14/0.31/0.12	0.15/0.22/0.22/0.21	0.20/0.36/0.34/0.20	0.02/0.92/0.90/0.89	0.93/0.92/0.93/0.89	0.94/0.92/0.90/0.90	0.93/0.92/0.90/0.88	0.26/0.34/0.33/0.28	0.39/0.38/0.38/0.32	0.96/0.96/0.94/0.94	0.82/0.94/0.93/0.93
								0.14/0.11/0.32/0.47	0.11/0.10/0.27/0.43		
								0.91/0.90/0.89/0.92	0.89/0.88/0.85/0.88		

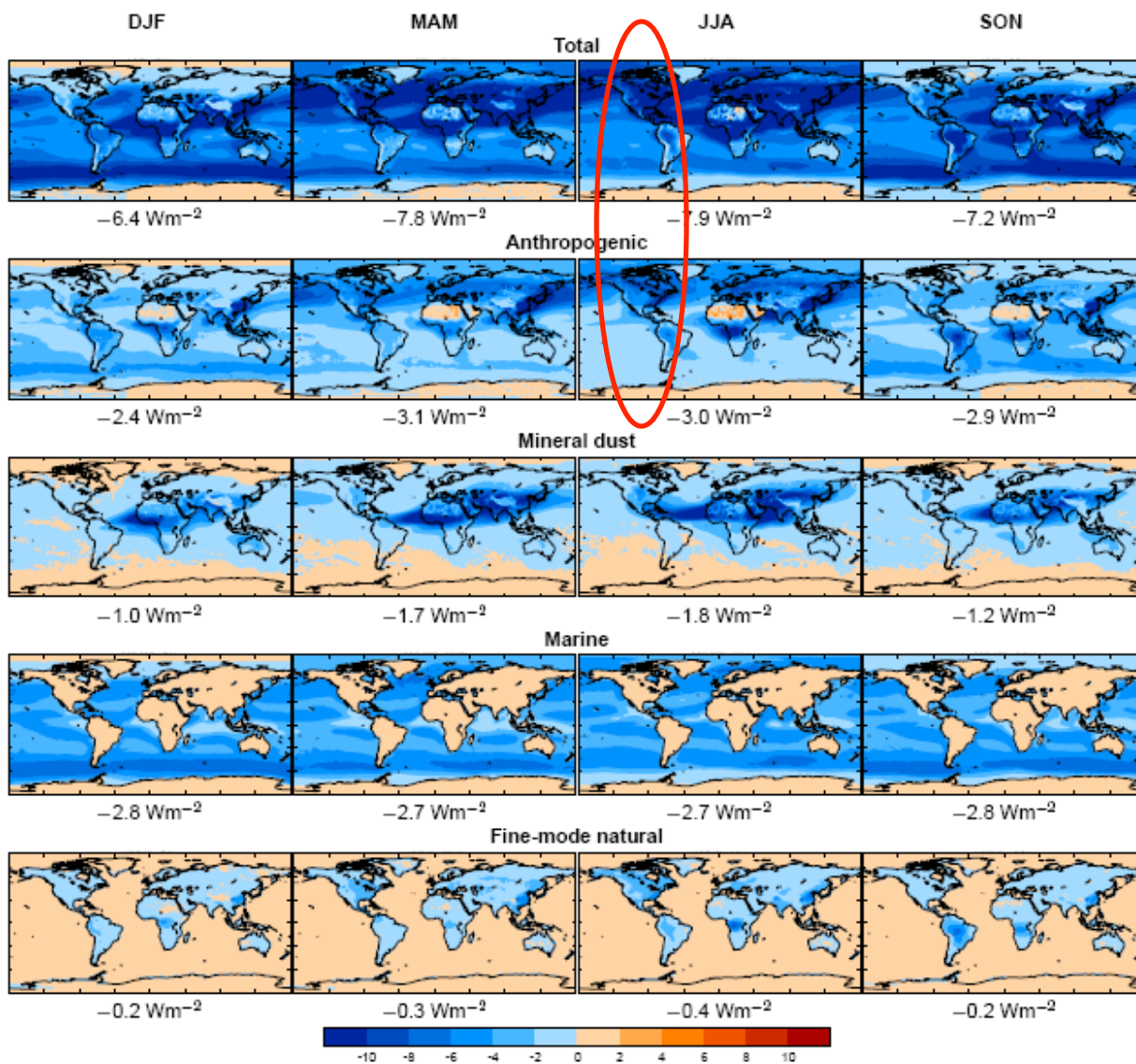
DRE (Wm <sup>-2</sup> ) at the TOA (upper) and surface (lower)											
DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON	DJF/ MAM/ JJA/ SON
-1.9/-4.4/-5.2/-2.7	-2.8/-8.1/-11.1/-4.5	-5.0/-7.0/-6.1/-5.8	-6.4/-10.7/-8.1/-5.3	-3.6/-10.1/-14.4/-6.7	-5.2/-12.6/-23.8/-10.8	-6.4/-17.6/-21.0/-14.9	-11.9/-28.2/-30.4/-15.7	-8.4/-10.7/-10.4/-9.2	-9.1/-9.8/-9.0/-8.1	-14.5/-20.0/-23.2/-16.1	-23.5/-23.8/-24.3/-20.1
								-3.9/-3.4/-7.2/-11.2	-2.7/-3.0/-6.4/-9.6		
								-11.4/-9.4/-23.3/-30.9	-10.6/-9.0/-23.5/-33.9		



JJA Model TOA: -4.0 to -8.7 W m<sup>-2</sup>; Obs. TOA: -5.2 to -11.1 W m<sup>-2</sup>; Obs. Surface: -14.4 to -23.8 W m<sup>-2</sup> (Yu et al., 2006)



# TOA DRE



**JJA (SW)**  
**CONUS DRE < -10  $\text{W m}^{-2}$ ;**  
**Global DRE = -7.9  $\text{W m}^{-2}$**

**Anthropogenic:**  
**CONUS: -2 to -8  $\text{W m}^{-2}$**

**(Bellouin et al., 2013)**

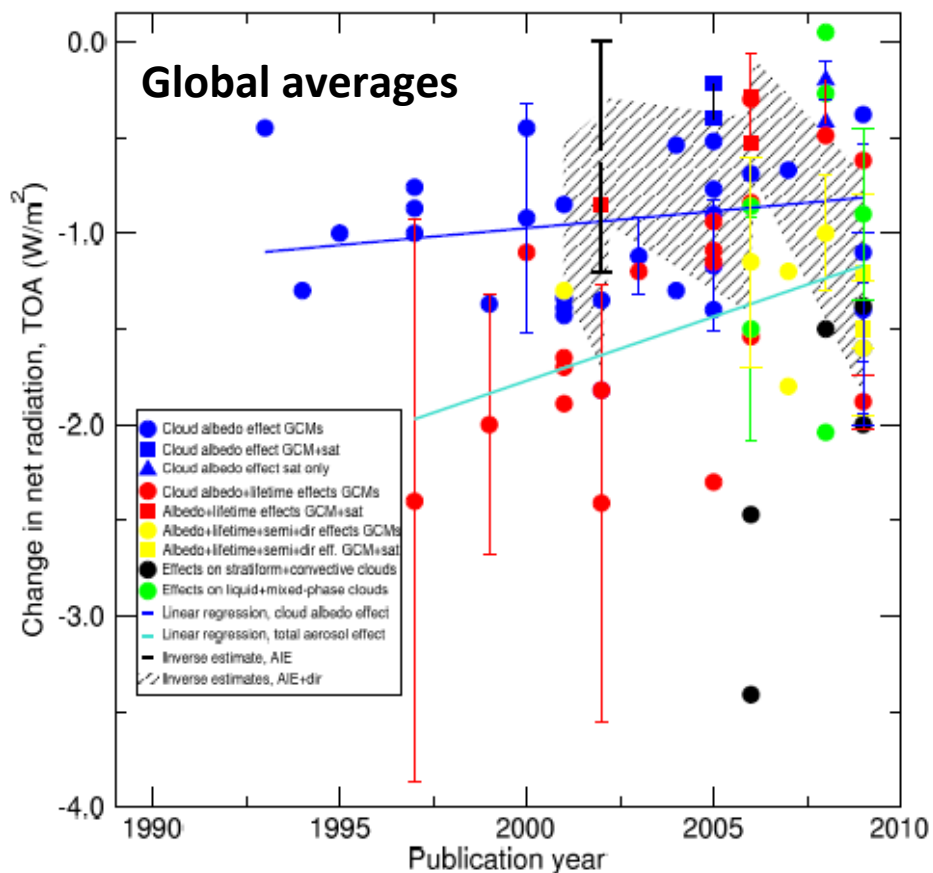




# Anthropogenic Aerosol Indirect Effects

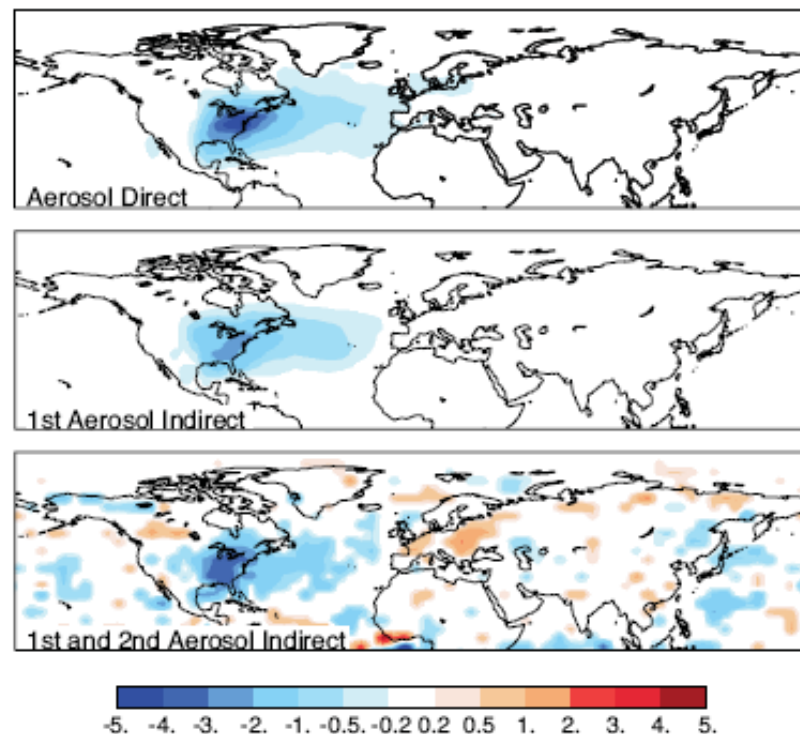
## Aerosol Indirect Radiative Effects (large uncertainties)

Published estimates of the aerosol indirect effect  
Anthropogenic changes in net radiation at the TOA



Lohmann et al. (2010)

Radiative Forcing from US Anthropogenic Aerosols in 1980 ( $\text{W m}^{-2}$ )



Leibensperger et al. (2012)



## ARE...

**Table 1. Reported Aerosol Radiative Effects ( $\text{W m}^{-2}$ )**

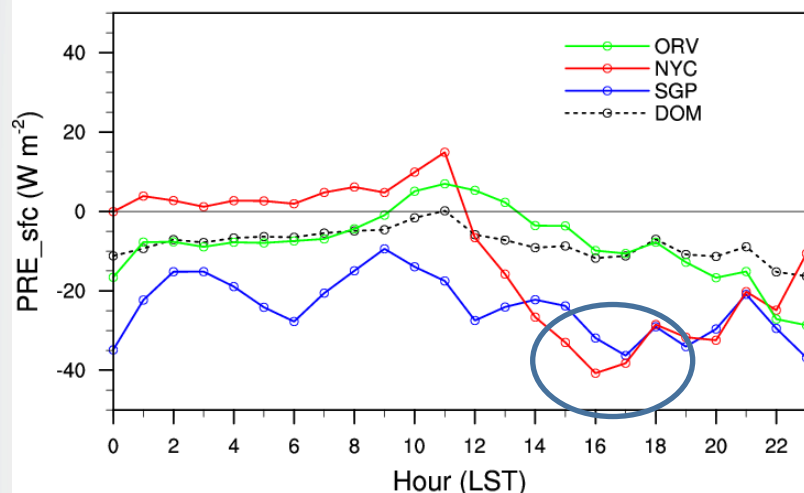
	CONUS	Globe	References
Surface	-14.4 to -23.8 (DRE) -9.1 (PRE)	-11.8 $\pm$ 1.9 (DRE, land) -11.5 $\pm$ 1.9 (DRE, land)	Yu et al. (2006) Bellouin et al. (2013) This work
Troposphere	-1.0 (PRE)	+5.1 (DRE, land)	Bellouin et al. (2013) This work
TOA	< -10 (DRE) -4.0 to -8.7 / -5.2 to -11.1 (DRE) ~ -4 (DRE) ~ -2.0 (anthro. DRE) ~ -2.0 (anthro. IRE) -10.5 (PRE)	-6.4 $\pm$ 1.0 (DRE, land) -4.9 $\pm$ 0.7 (DRE, land) -0.5 to -5 (IRE, land) -2.3 $\pm$ 0.9 (land)	Bellouin et al. (2013) Yu et al. (2006) Heald et al. (2014) Lohmann and Feichter (2005) Leibensperger et al. (2012) Quaas et al. (2009) This work

- ❑ On regional/continental scales, PRE is close to upper limit of ARE.  
Using integrated modeling system (e.g., online coupled model) might reduce TOA radiative biases.

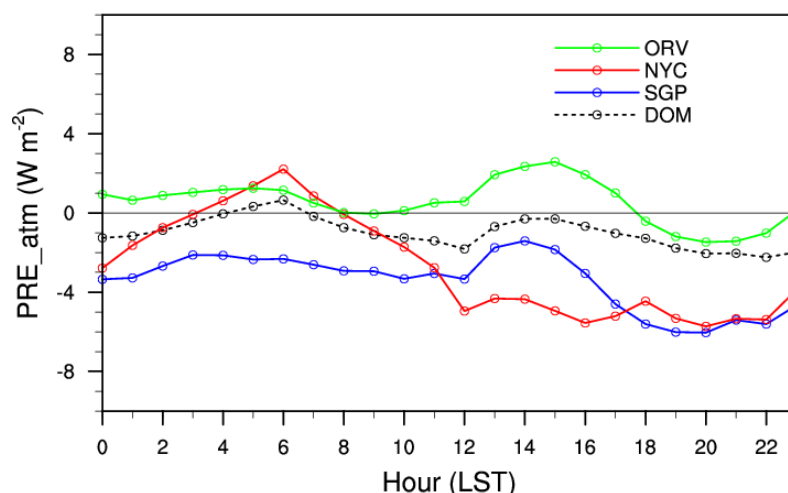


# Diurnal Variation of PRE

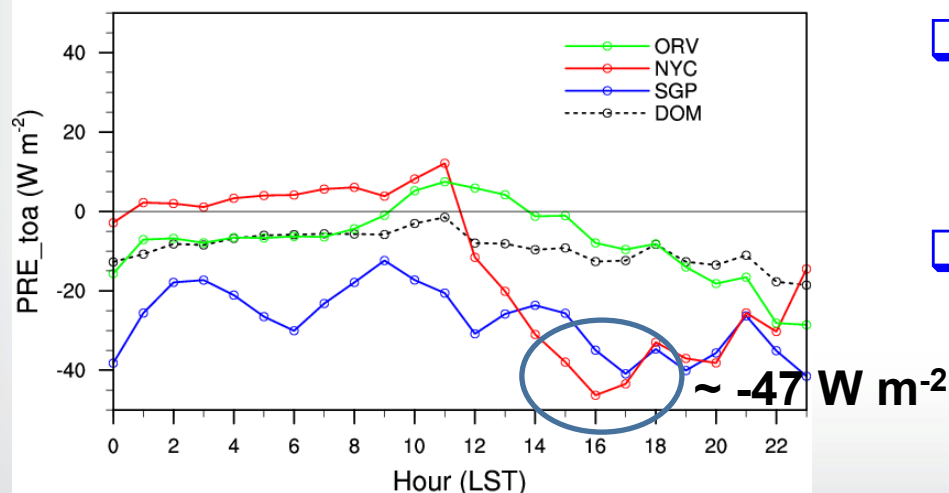
PRE at Surface (PRE\_sfc)



PRE in Atmosphere (PRE\_atm)



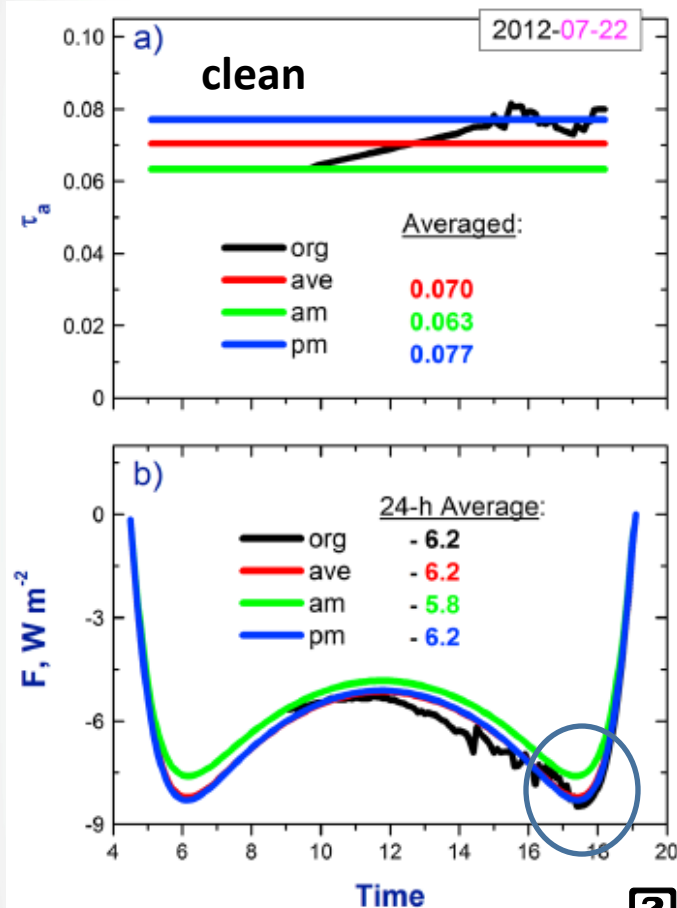
PRE at TOA (PRE\_toa)



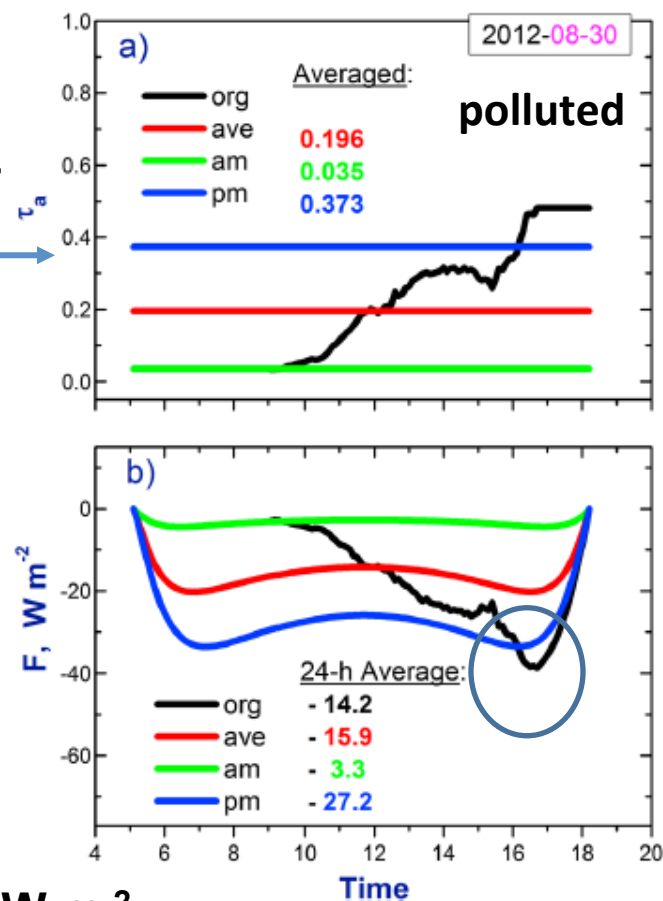
- ❑ Cooling/warming effects are much higher in local scales than large domain averages.
- ❑ Cooling/warming effects can be nonlinear depending on the sizes of model errors.



# Diurnal Variation of ARE (TOA)



80% higher  
in AOD



$[?] F_{max} = \sim -30 W m^{-2}$

Cape Cod (Kassianov et al., 2013)

PRES could overwhelm ARE at polluted sites.

- ❑ Surface energy balance errors dominate TOA energy balance.
- ❑ Using an integrated modeling system might reduce radiative biases for large domain averages at the top of the atmosphere.
- ❑ But, PRE could overwhelm ARE at local scales in an integrated modeling system.





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- ❑ The views expressed and the contents are solely the responsibility of the authors, and do not necessarily represent the official views of the US EPA.