

# *Linking Regional Aerosol Emission Changes with Multiple Impact Measures through Direct and Cloud-Related Forcing Estimates*

*Tami C. Bond & Yanju Chen*

*University of Illinois at Urbana-Champaign*

*Xin-Zhong Liang & Hao He*

*University of Maryland*

*David G. Streets, Ekbordin Winijkul, and Fang Yan*

*Argonne National Laboratory*

*Praveen Amar, Danielle Meitiv*

*Clean Air Task Force*

# Organization

- ❑ Project overview – Tami Bond
- ❑ Size-resolved emission inventory – Dave Streets, reported by Tami Bond
- ❑ U.S. regional cloud modeling – Hao He
- ❑ Emission-to-forcing measures – Yanju Chen
- ❑ Policy-relevant metrics– Praveen Amar, reported by Tami



# Project Overview

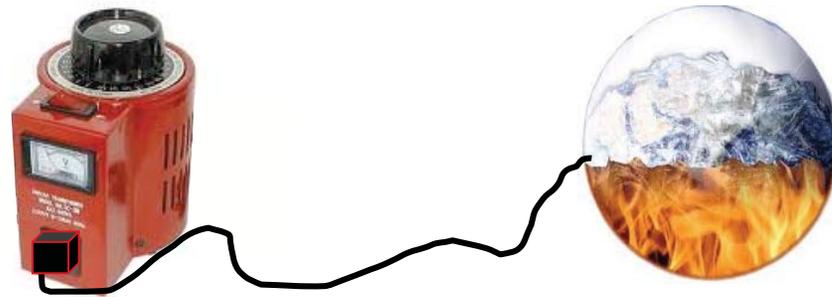
PROJECT OVERVIEW

*Or, Why we Did What We Did*

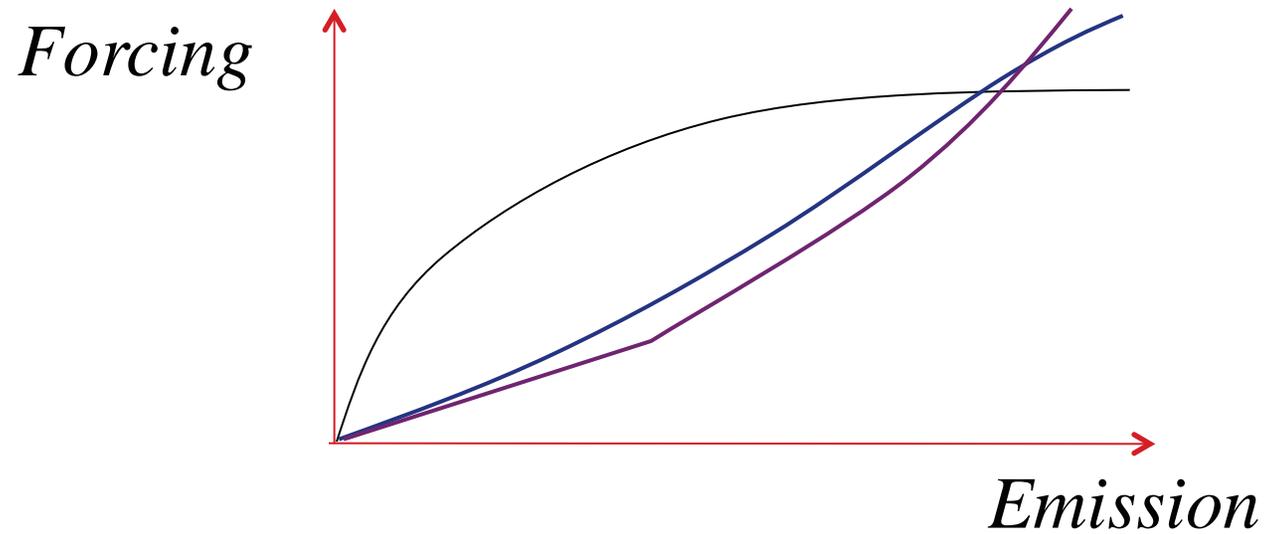
(Tami Bond)



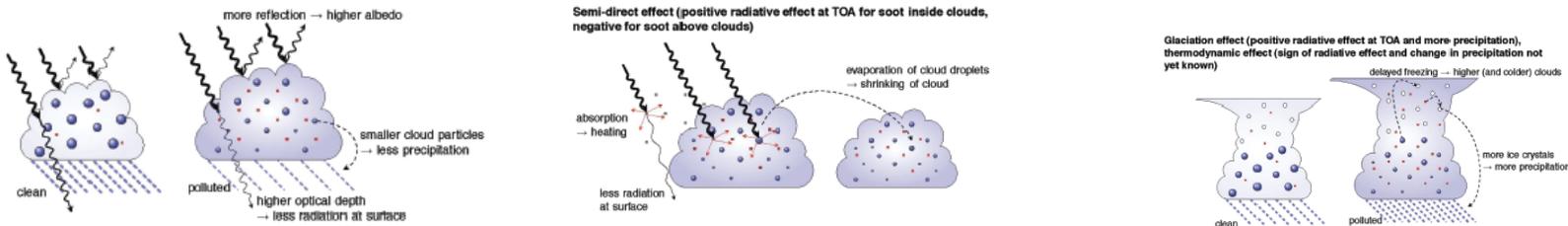
# The simple view



A dose-response curve for the atmosphere



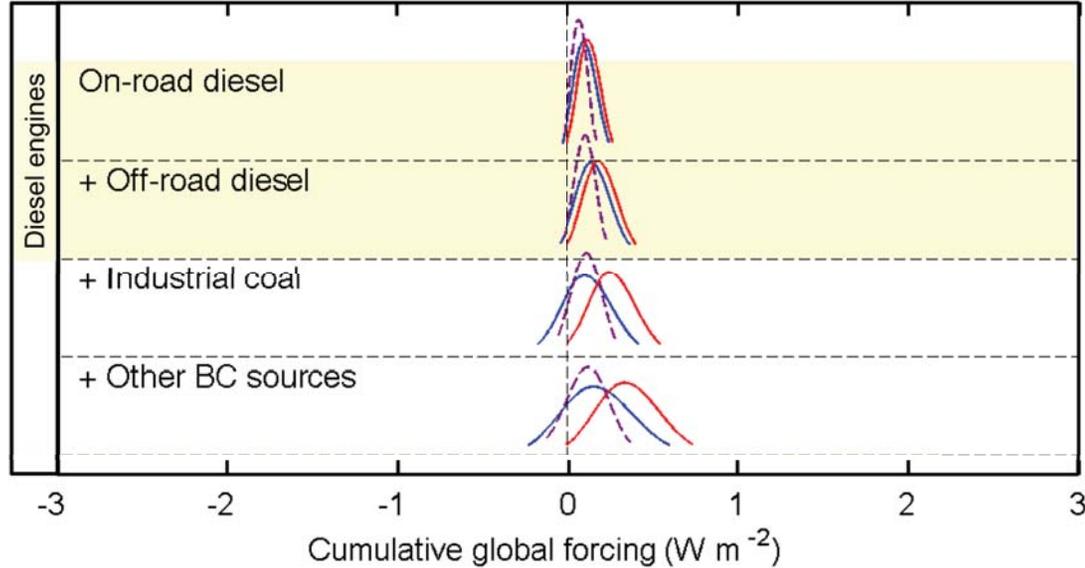
# The big uncertainty in BC-rich sources



- ❑ BC → direct forcing ~ bounded
- ❑ BC → cloud forcing  
~ large uncertainties – especially in **ice/mixed**
- ❑ OC + SO<sub>4</sub> → direct forcing  
~ small for BC-rich sources
- ❑ OC + SO<sub>4</sub> → cloud forcing  
~ large and probably negative

*It's the indirect effects of co-emitted species that cause big questions about immediate forcing*

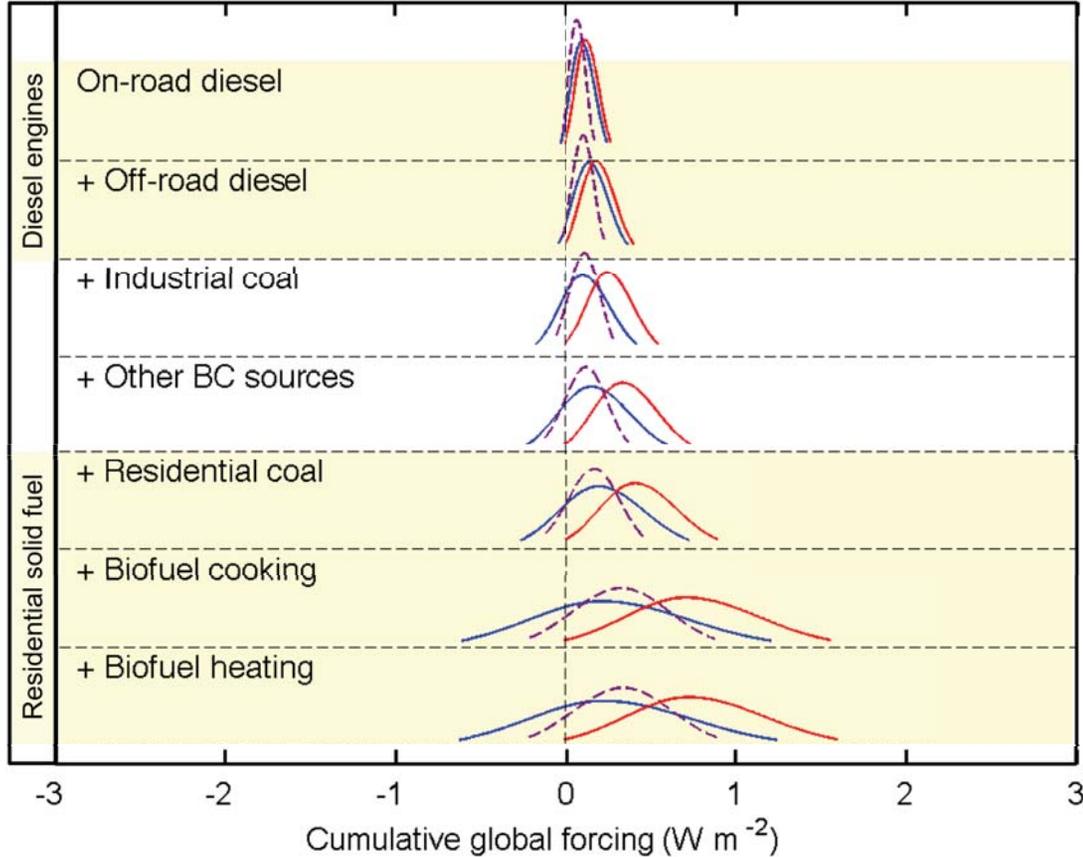
# Cumulative forcing (add successive categories)



BC forcing positive (+0.33)  
Total forcing positive (+0.15)



# Cumulative forcing (add successive categories)

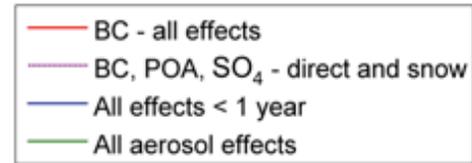
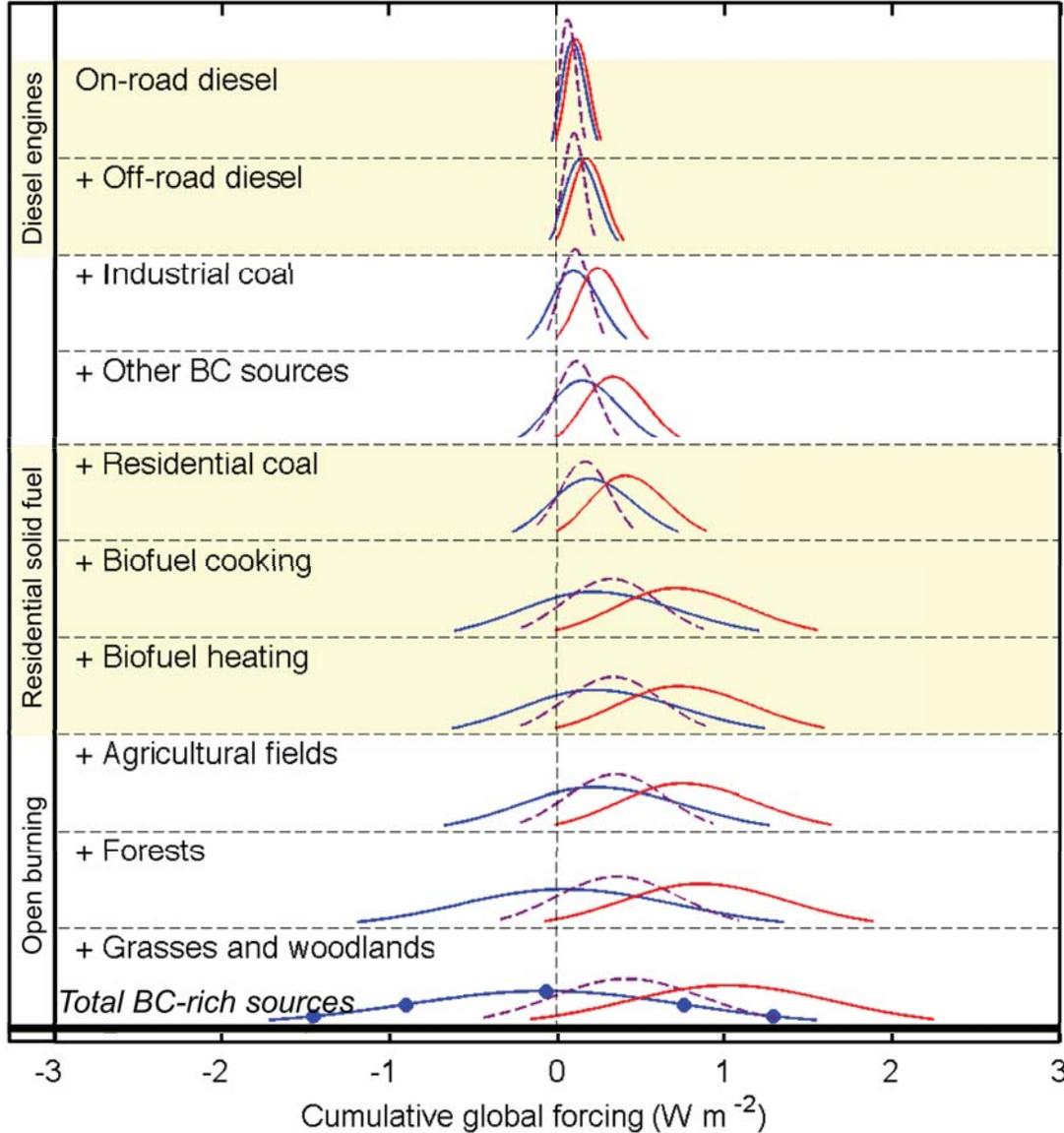


BC forcing positive (+0.33)  
Total forcing positive (+0.15)

BC forcing positive (+0.72)  
Total forcing still positive (+0.21)  
but becoming less certainly so,  
because of cloud uncertainties



# Cumulative forcing (add successive categories)



BC forcing positive (+0.33)  
Total forcing positive (+0.15)

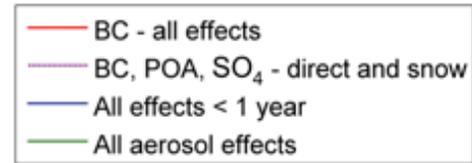
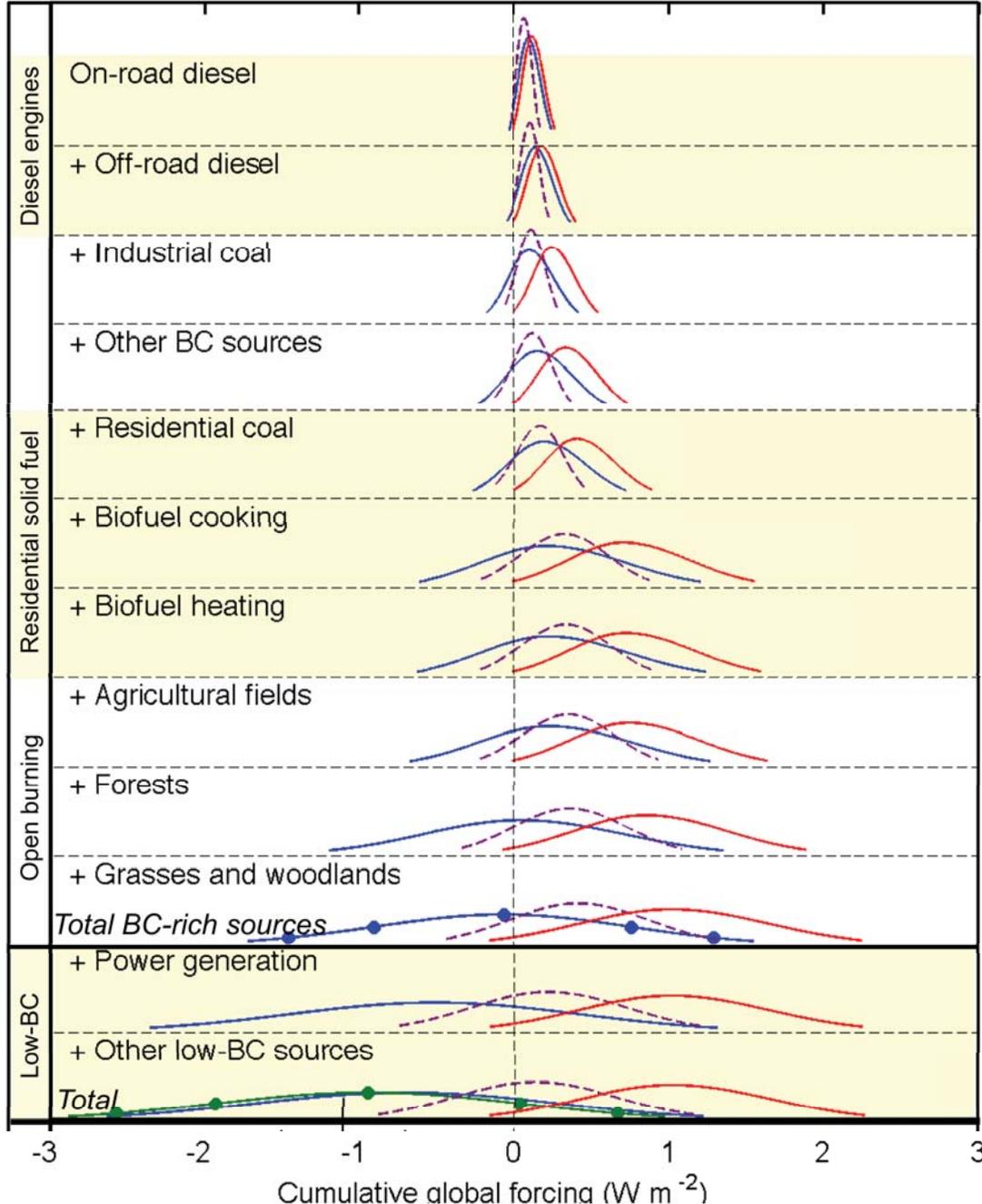
BC forcing positive (+0.72)  
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BC forcing positive (+1.01)  
Total forcing nearly neutral (-0.06)  
because of large OC & its cloud forcing  
(note: simple sum differs from BC  
median produced by Monte Carlo analysis)

Bounding-BC Fig 38



# Cumulative forcing (add successive categories)



BC forcing positive (+0.33)  
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(note: simple sum differs from BC  
median produced by Monte Carlo analysis)

Remainder of aerosol forcing  
is in low-BC categories (total -0.95)

Bounding-BC Fig 38





So you got [*some scientific thing*] right. Who cares? Tell me if I should turn this off!



Can you wait 6 months? I have to run my model...



Need a *forcing-to-emission* ratio

*Simple*

$$\text{Forcing}_{\text{source}} = \frac{\text{Forcing}_{\text{modeled}}}{\text{Emission}_{\text{modeled}}} \times \text{Emission}_{\text{source}}$$



# Need a *forcing-to-emission* ratio

## Simple

$$\text{Forcing}_{\text{source}} = \frac{\text{Forcing}_{\text{modeled}}}{\text{Emission}_{\text{modeled}}} \times \text{Emission}_{\text{source}}$$

## Complex

$$CF = FC \sum_{i=1}^I EF_i \left( \sum_{j=1}^J rforc_{i,j} + \sum_{k=1}^K fresp_{i,k} \right)$$

climate forcing

fuel consumption

emission factor

forcing per emission

response per emission

$$rforc_{i,j} = \left. \frac{\partial f_j}{\partial e_i} \right|_{PD}$$

Bounding-BC  
equation 11.1&1



# Definition

Emission-Normalized Forcing (ENF)

*including*

ENDRF

ENIRF

Direct Radiative

Indirect Radiative

---

$$\frac{\text{Forcing}_{\text{modeled}}}{\text{Emission}_{\text{modeled}}}$$

approximates this:

$$rforc_{i,j} = \left. \frac{\partial f_j}{\partial e_i} \right|_{PD}$$



# Detour: Climate “metrics”

Normal people think:

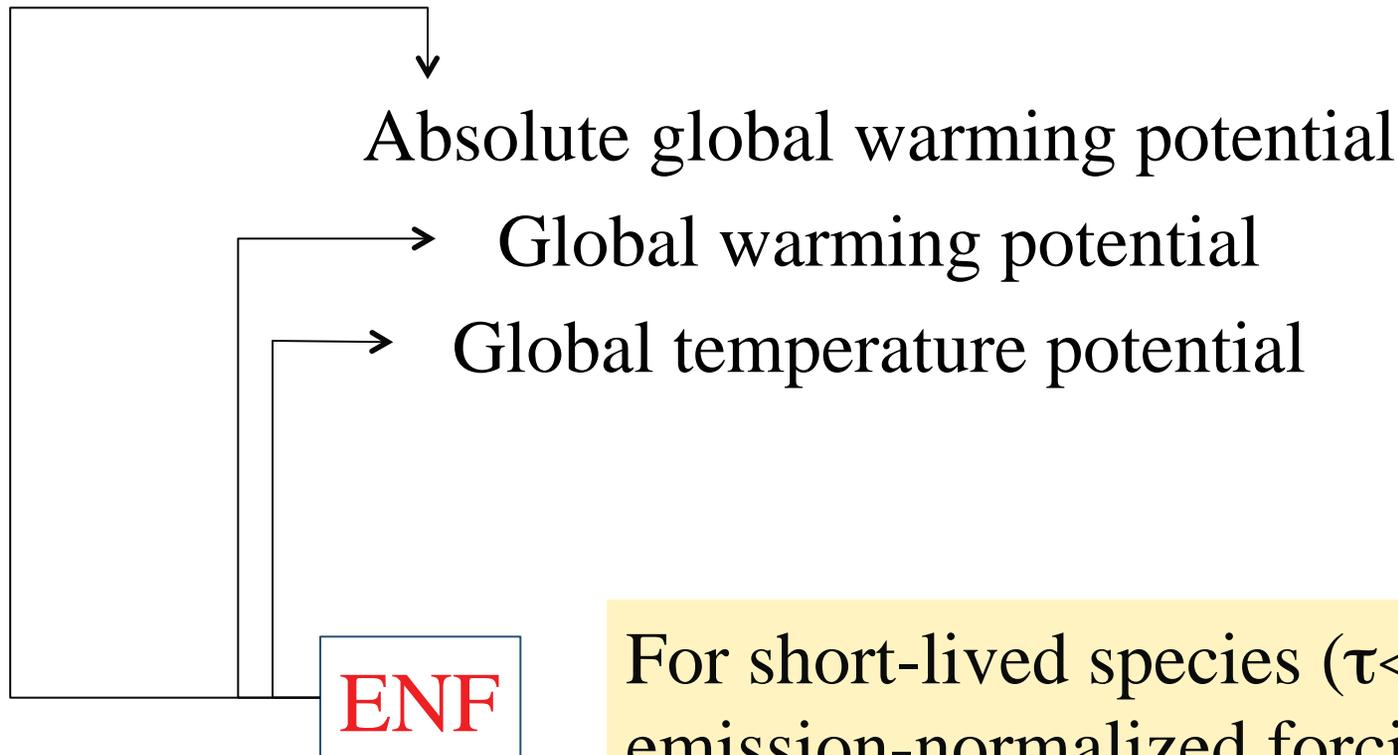
A metric is something you can measure, and report

The climate policy community says:

A metric is a well-defined calculation that can be used to *equate* a mass emission of some species to a mass emission of the big bear, CO<sub>2</sub>



# Some climate metrics



For short-lived species ( $\tau < 4$  mo), emission-normalized forcing is the *only* model output required to calculate *any* of these metrics.

Other considerations affect the values of emission metrics, but they all come from models of the carbon cycle or Earth's heat capacity, NOT from models of aerosols

# Complaints against ENF

Forcing is not linear!

You can't do that for CLOUDS!

It's different in every REGION.

Anyway none of the model runs were designed for that.



Need: Emission-normalized forcing for both direct forcing and cloud mechanisms.

*Objective 3: Determine functional relationships that express changes in direct and cloud radiative forcing as a function of emission changes in particular locations*



Need: Emission-normalized forcing for both direct forcing and cloud mechanisms.

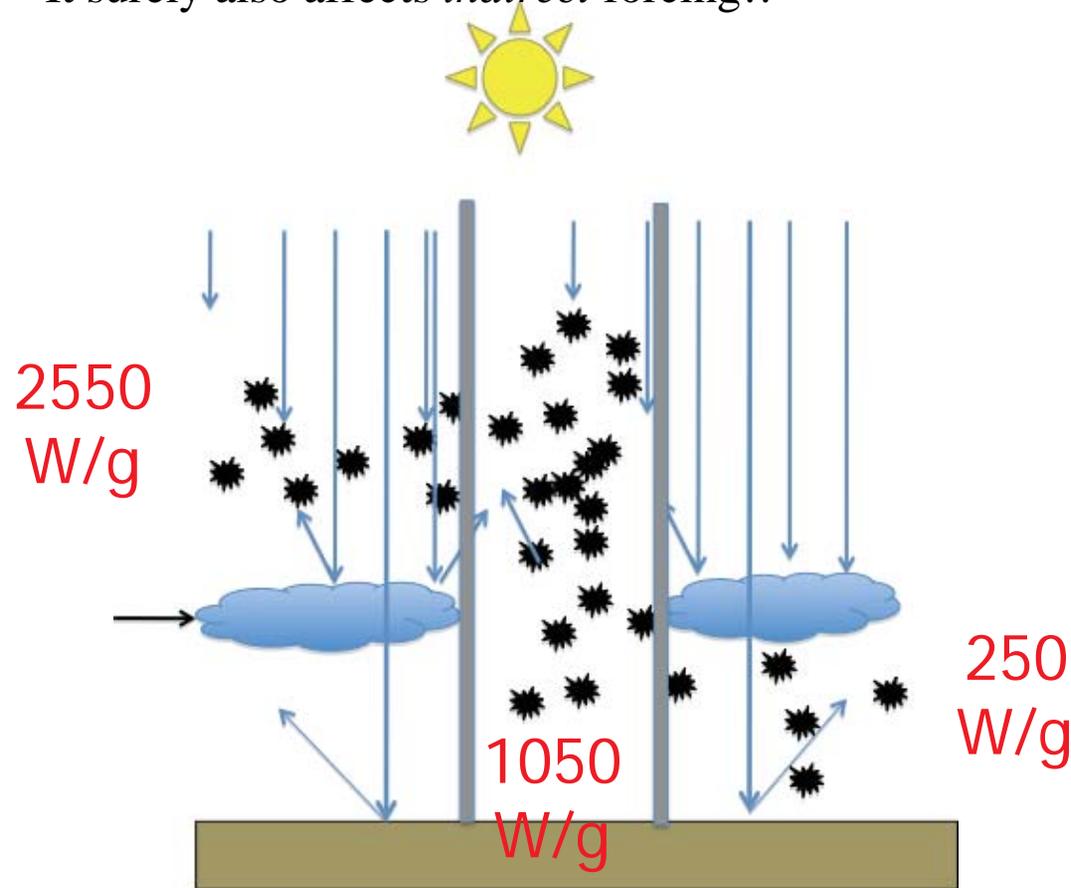
*Objective 3: Determine functional relationships that express changes in direct and cloud radiative forcing as a function of emission changes in particular locations*

*But wait...*



# Relative location of BC and clouds affects direct forcing

It surely also affects *indirect* forcing!!



*In this earlier study, we found that the modeled clouds were*

*Community Atmospher*

*Zarzycki & Bond, GRL 2010*

*Note: Also affects semi-direct forcing; see Ban-Weiss et al, Clim Dyn, 2011*

# Strategy: Compare modeled fields with ISCCP observations

ISCCP = International Satellite Cloud Climatology Project

ISCCP Total Cloud Amount  
1983-1990

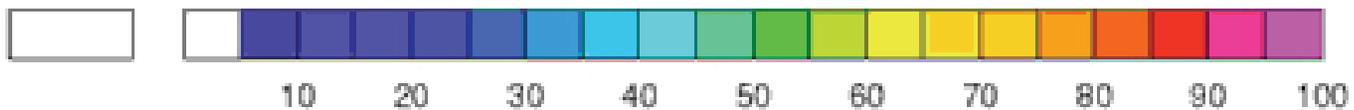
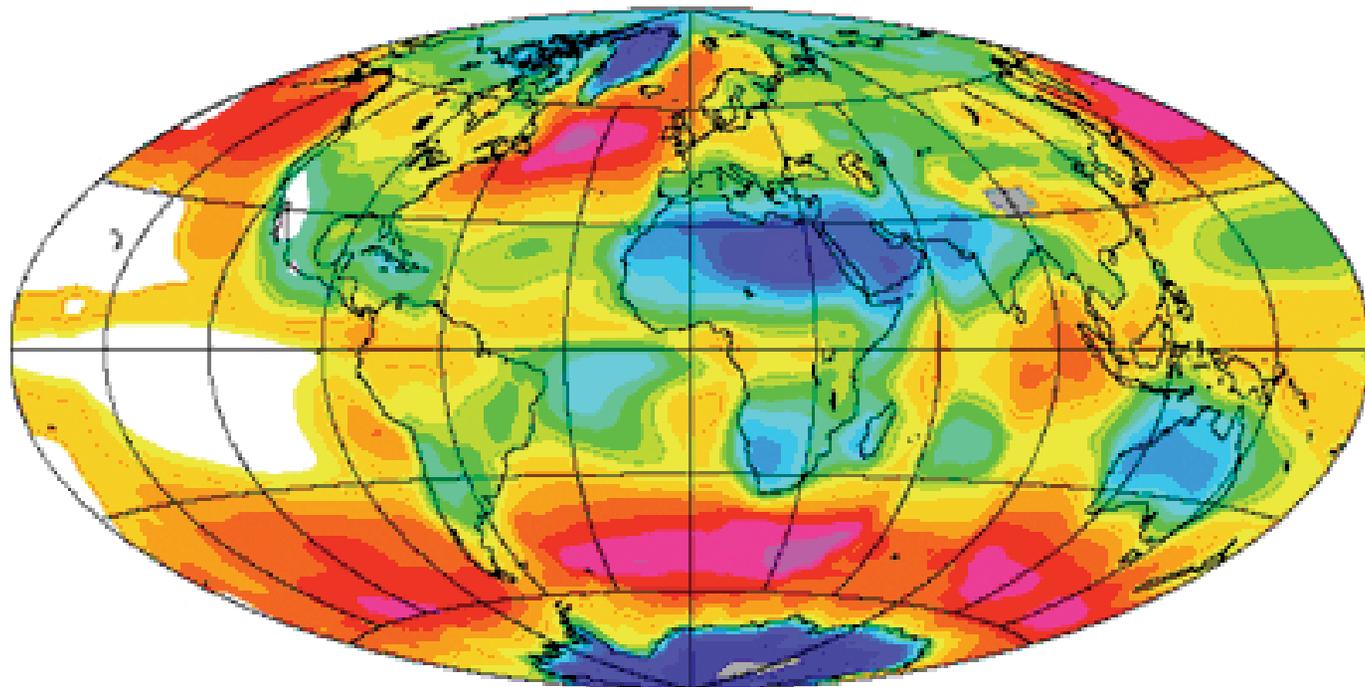


image: nasa.gov

Percent



Need: Confidence in modeled clouds before inferring cloud forcing from a model.

*Objective 2: Employ an ensemble of parameterizations in regional-scale models to identify best estimates and uncertainties for fields of direct and cloud-related forcing*



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*But wait...*



# Aerosol effects are size-dependent

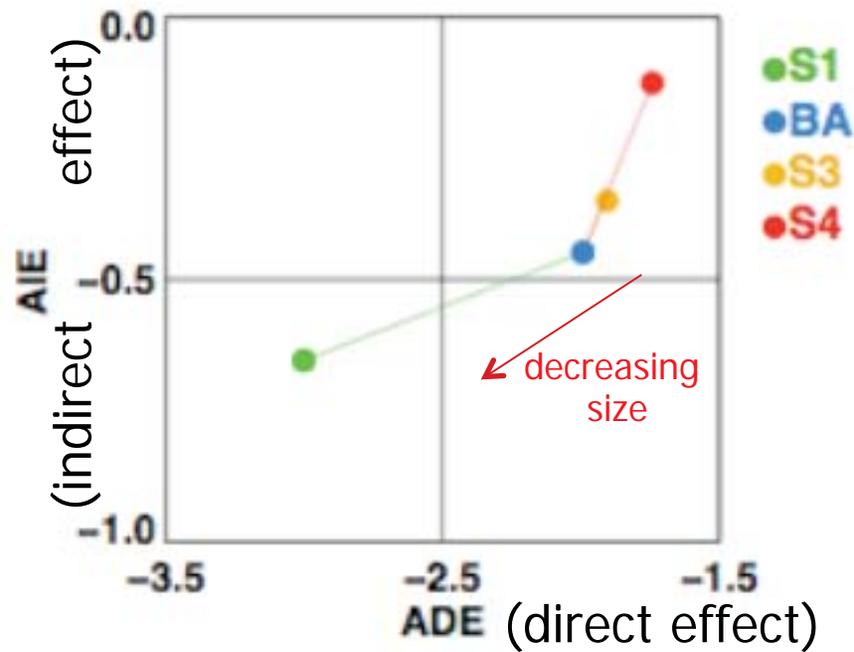


Fig. 4. Global mean AIE and ADE [W/m<sup>2</sup>] values for all size experiments, (S1–4) and the base experiment, BA, for present day conditions.

*Bauer et al., ACP, 2010*  
for carbonaceous aerosols



Need: Knowledge of emission size distributions.

*Objective 1: Develop size-resolved, speciated emission inventories of aerosols and aerosol precursors*



Need: Knowledge of particle size, beginning with emission.

*Objective 1: Develop size-resolved, speciated emission inventories of aerosols and aerosol precursors*

*But wait...*





YES?!  
I'm waiting....





YES?!  
I'm waiting....



Need: Policy-distilled measures or metrics

*Objective 4: Iterate emission-to-forcing  
measures as communication tools  
between decision makers and climate  
scientists*



# Size-Resolved Emission Inventory

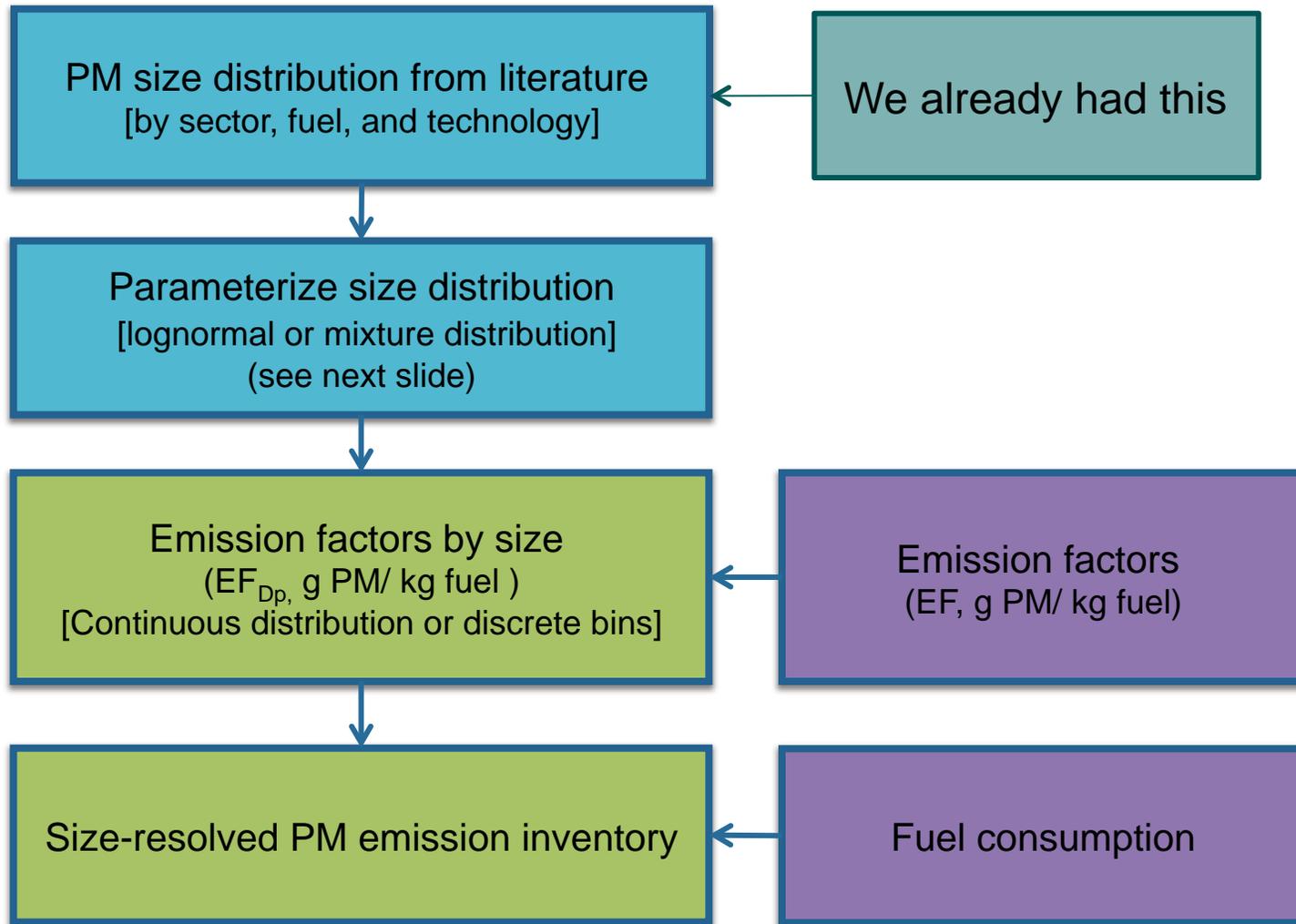
SIZE-RESOLVED EMISSION INVENTORY

*Or, Why we Did What We Did*

(David Streets, Ekbordin Winijkul, Fang Yan - Ar  
presented by Tami)



# Procedure



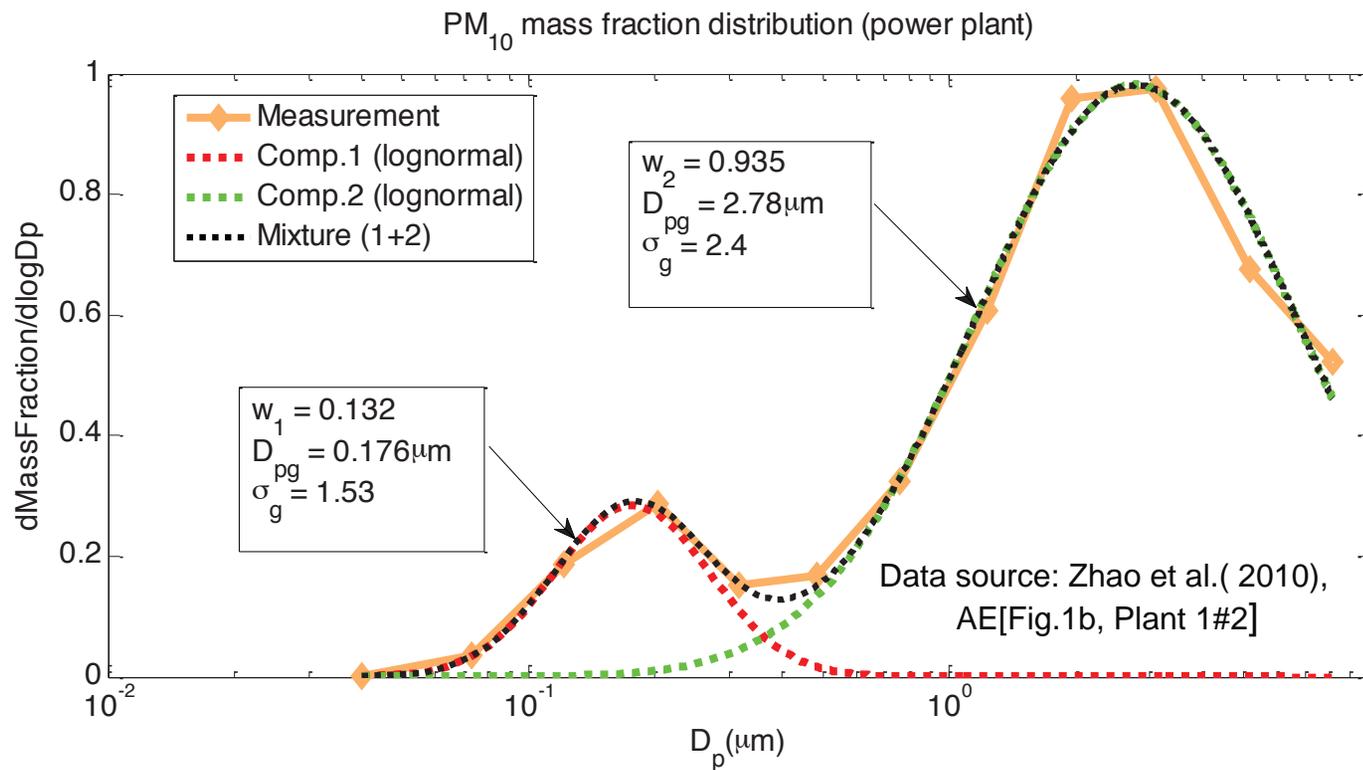
# Parameterizing size distribution

Fit with lognormal distribution...

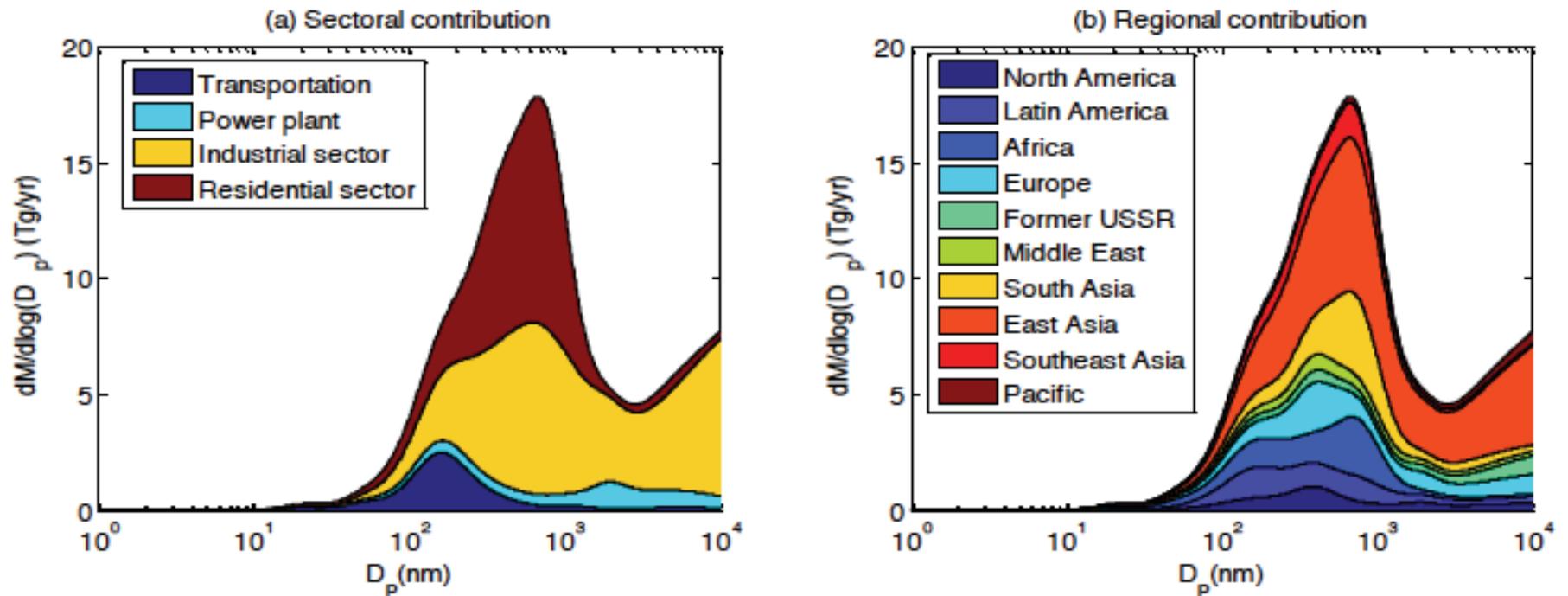
$$f(\ln D_p) = \frac{1}{\sqrt{2\pi} \ln \sigma_g} \exp \left[ -\frac{(\ln D_p - \ln \bar{D}_{pg})^2}{2 \ln \sigma_g^2} \right]$$

...or bimodal distribution

$$f(x) = w_1 f_1(x) + w_2 f_2(x) \quad 0 \leq w \leq 1$$



# Global size-resolved emission inventory

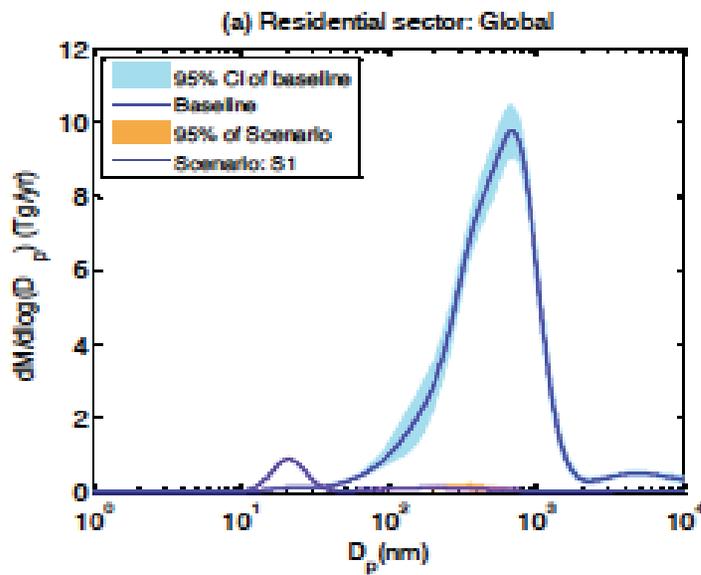


*Size-resolved global emission inventory of primary particulate matter (PM) from energy-related combustion sources*

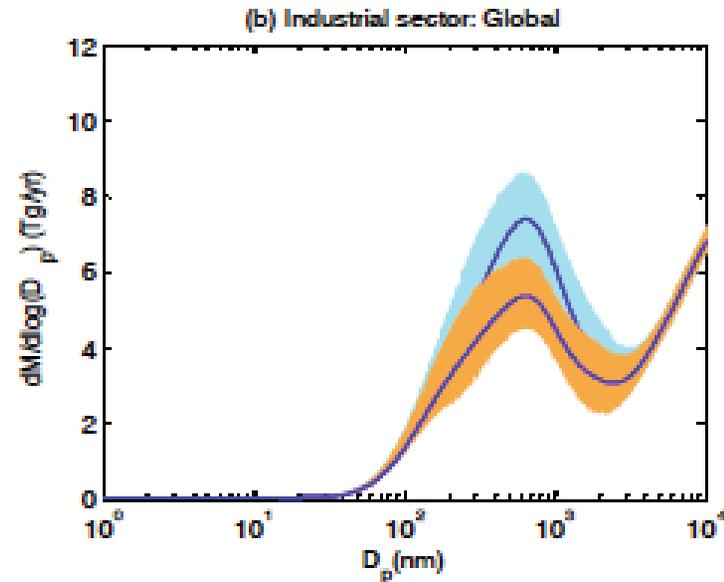
*E. Winijkul, F. Yan, Z. Lu, D. G. Streets, T. C. Bond, Y. Zhao*

*Submitted to Atmos Env, 28 August 2014*

# Work includes uncertainty and illustrative reduction scenarios



Residential:  
Switching from  
solid fuel to LPG



Industrial:  
Baghouses on cement kilns

*Winijkul et al., submitted, 2014*

# Regional Cloud Modeling

*Or, Get the Clouds Right*

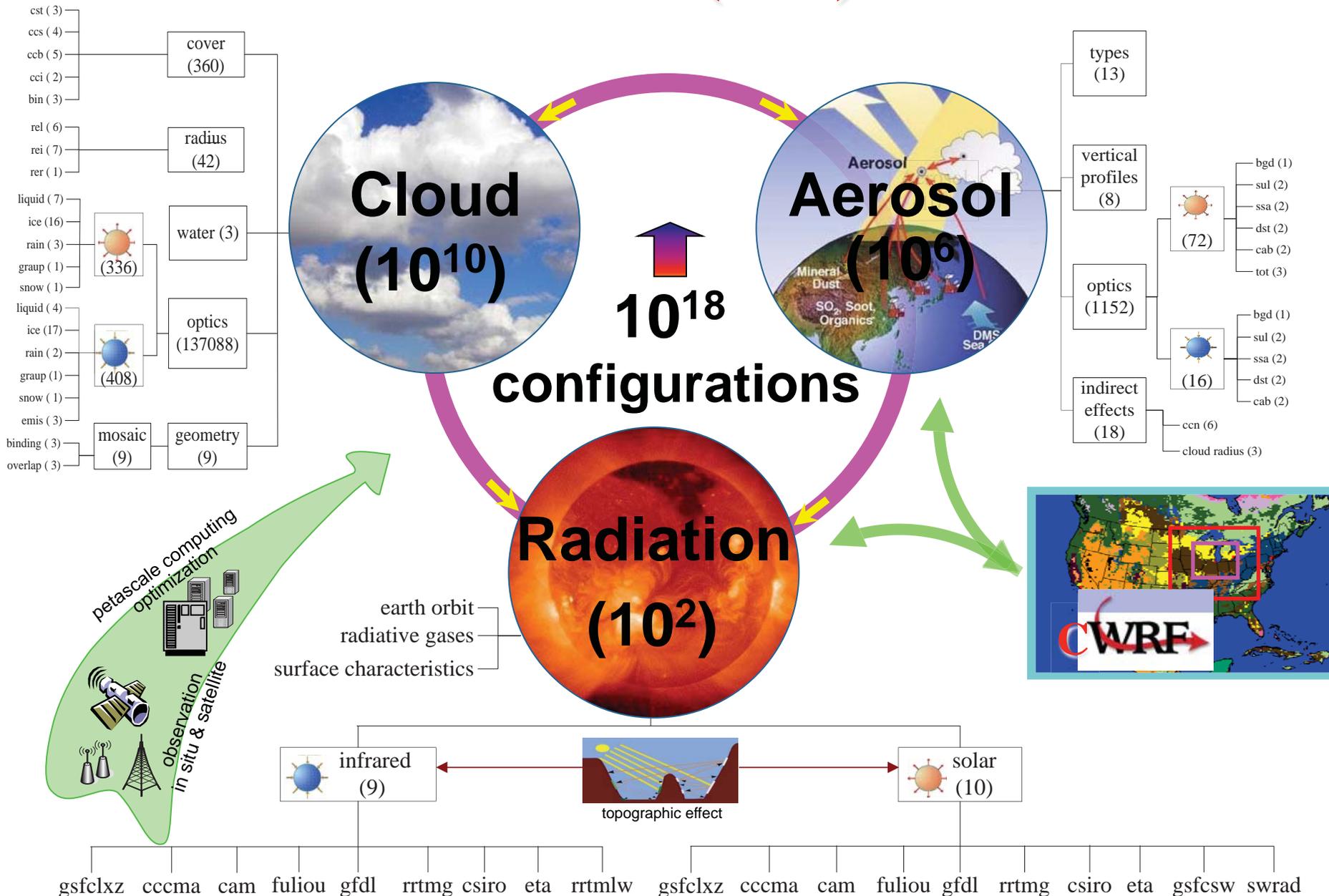
(Hao He, Xin-Zhong Liang – Univ of Maryland)

# Modeling Approach

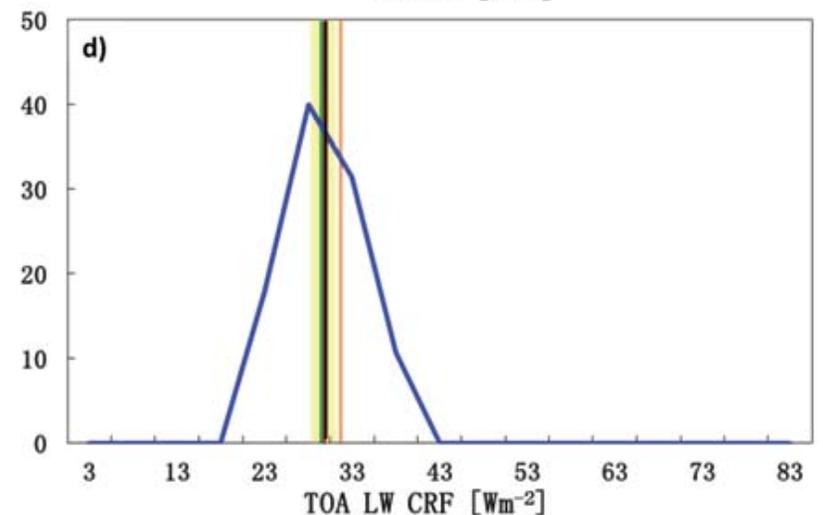
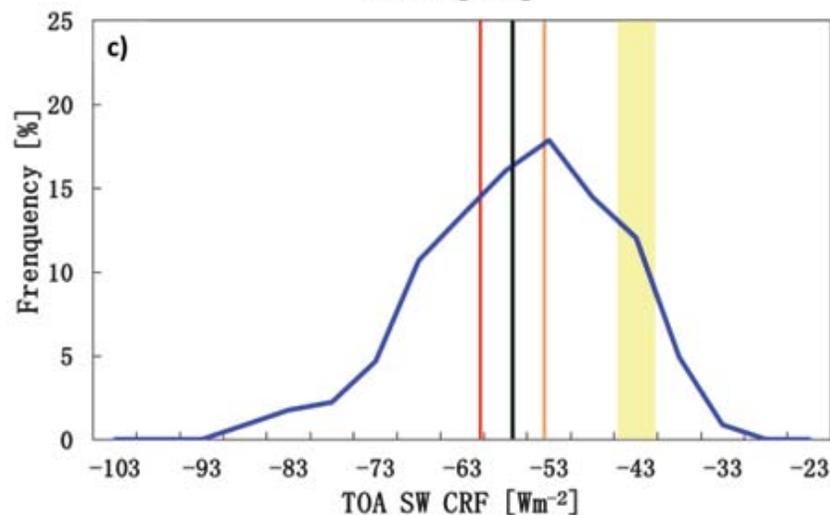
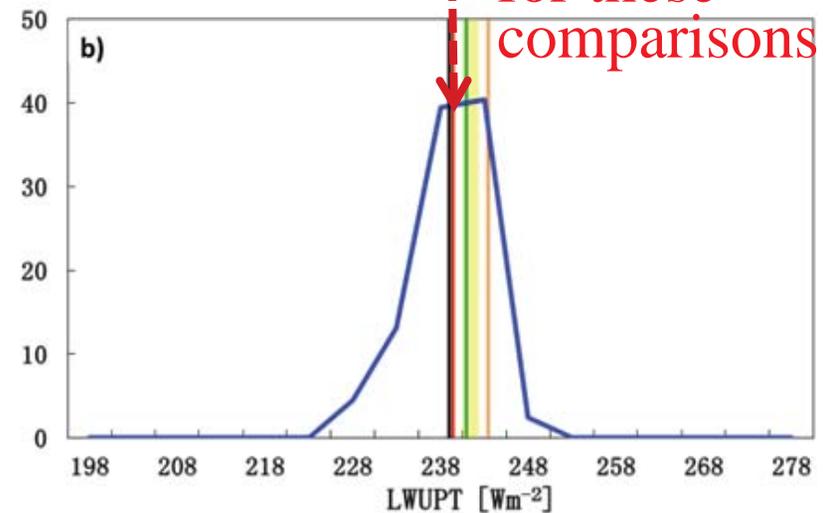
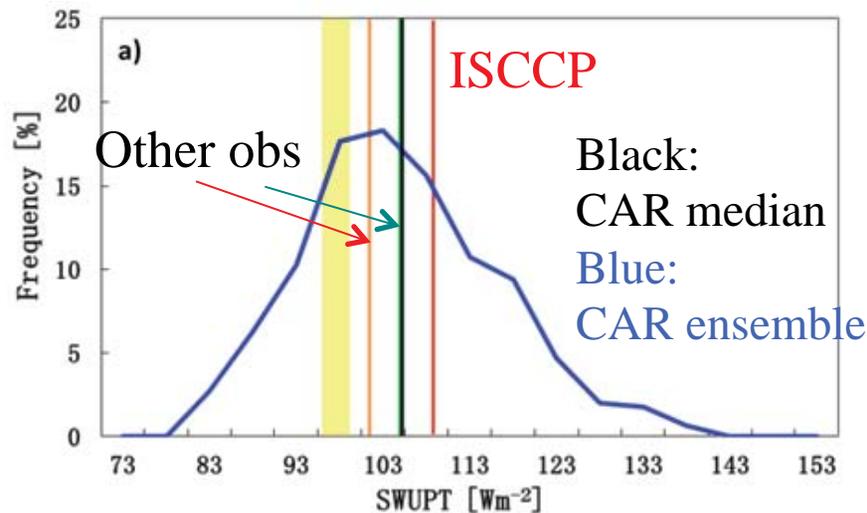
- ❑ We used the mesoscale Climate–Weather Research and Forecasting model (CWRF) model.
- ❑ Total aerosol field (not just BC) is produced by global models.
- ❑ CWRF has alternative parameterizations for cloud properties, aerosol properties, and radiation transfer.

*Purpose: Investigate range of climate forcing in models that agree with observations*

# Cloud-Aerosol-Radiation (CAR) Ensemble Model



# Uncertainty in Cloud-Aerosol-Radiation Modeling



Frequency distribution of TOA radiative flux and CRF averaged over  $[60^{\circ}\text{S}, 60^{\circ}\text{N}]$  in January 2004 from the CAR ensemble of 960 members

# Modeling Approach

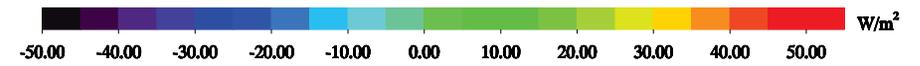
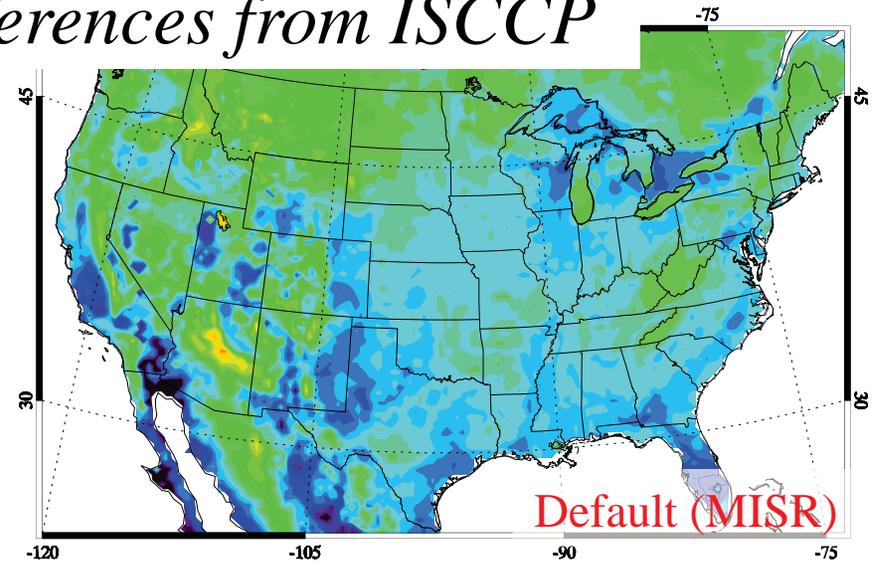
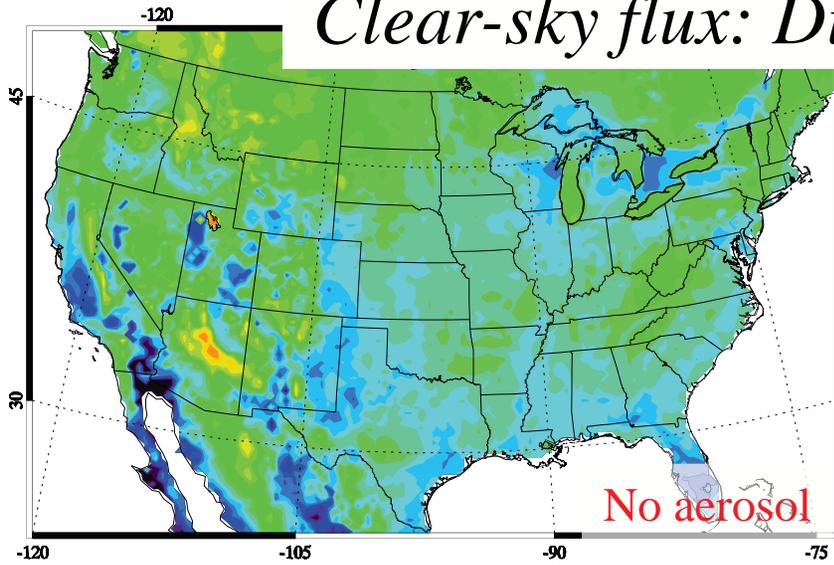
- ❑ Meteorology: ECWMF ERA interim reanalysis
- ❑ Canadian Centre for Climate Modeling and Analysis (CCCMA) radiation scheme
  
- ❑ Model run from 2001 to 2006, with the first year (2001) as spin-up. Average from 2002 to 2006 is presented.

## One base case; Five aerosol fields

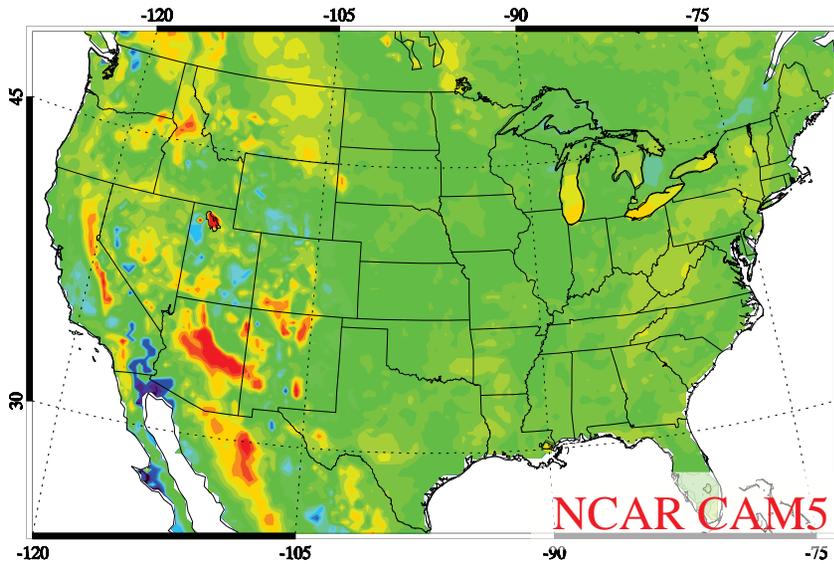
Case No.	Case Name	Temporal Resolution	Aerosol input
1	Noaerosol	N/A	Aerosol radiation Off
2	Default	Monthly	MISR Climatology
3	NCAR	Monthly	NCAR CAM2 model
4	GOCART <sup>\$</sup>	Monthly	GOCART model
5 <sup>#</sup>	CAM5	Monthly	UIUC CAM5 model
6 <sup>*</sup>	CAM5'	Monthly	UIUC CAM5 model

*<sup>\$</sup> Chin et al 2014; <sup>#</sup> Assuming all BC and OC are hydrophilic; <sup>\*</sup> Assuming only 85% of BC and OC are hydrophilic*

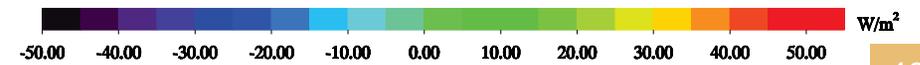
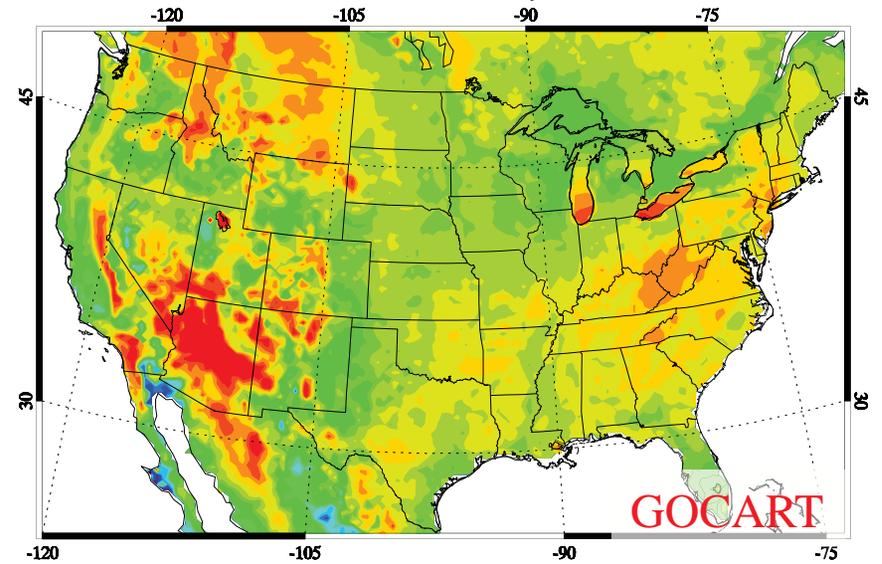
# Clear-sky flux: Differences from ISCCP



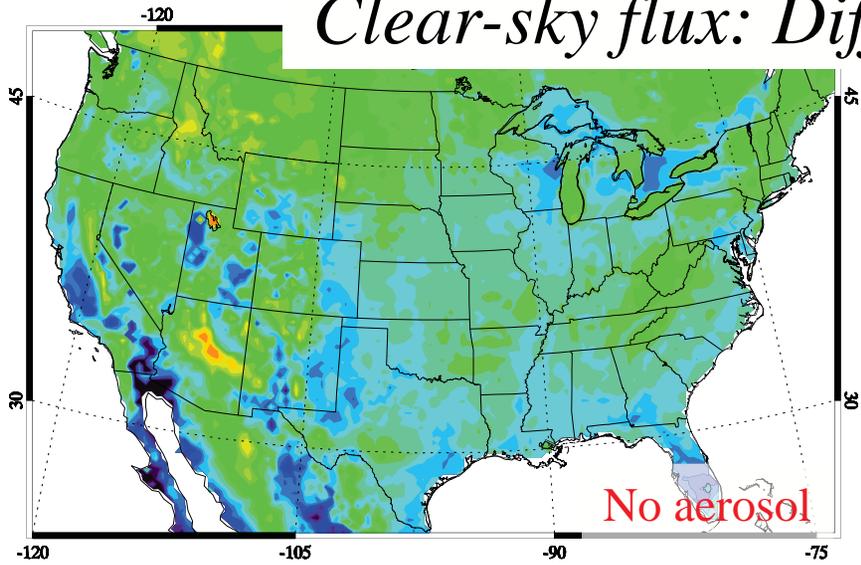
CWRF CTOAFlux 2002 cam5-ISCCP



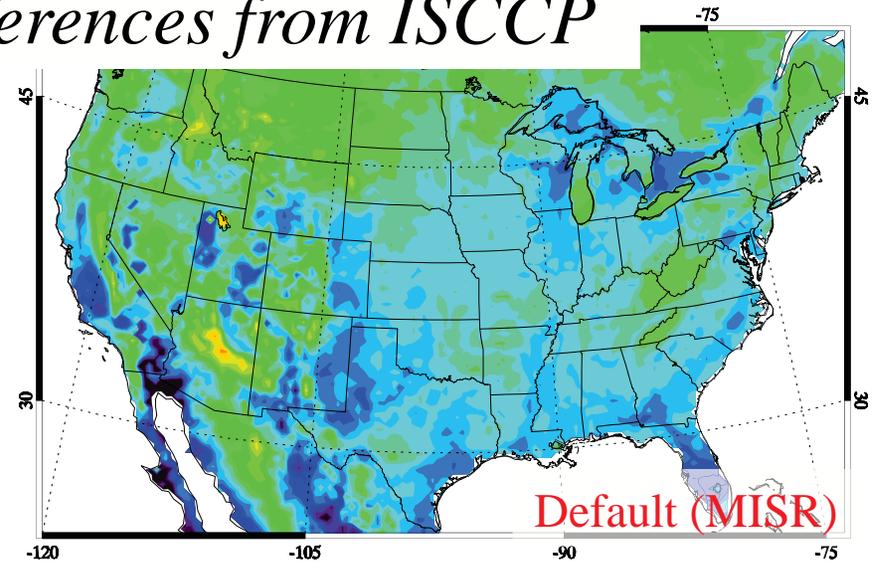
CWRF CTOAFlux 2004 gocart-ISCCP



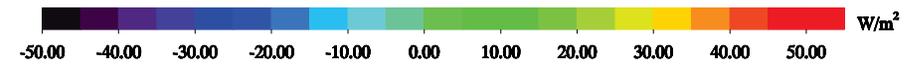
# Clear-sky flux: Differences from ISCCP



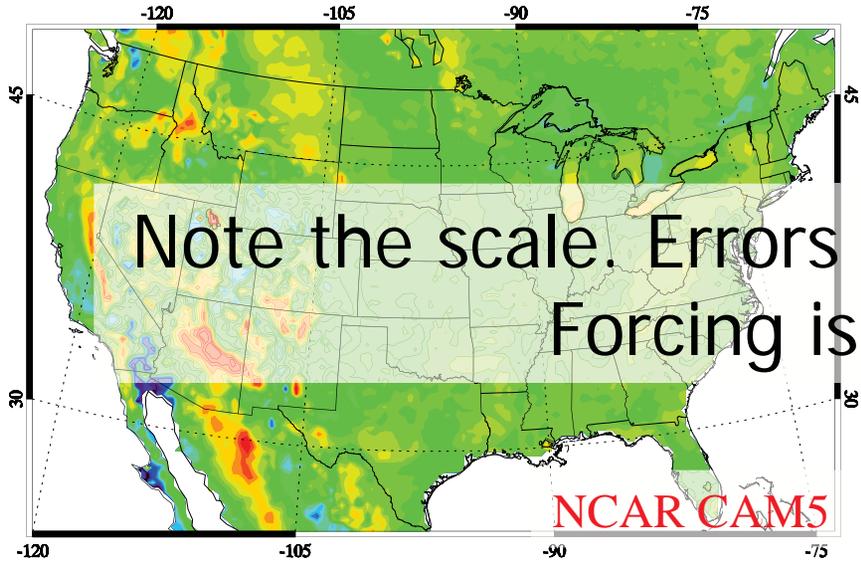
No aerosol



Default (MISR)

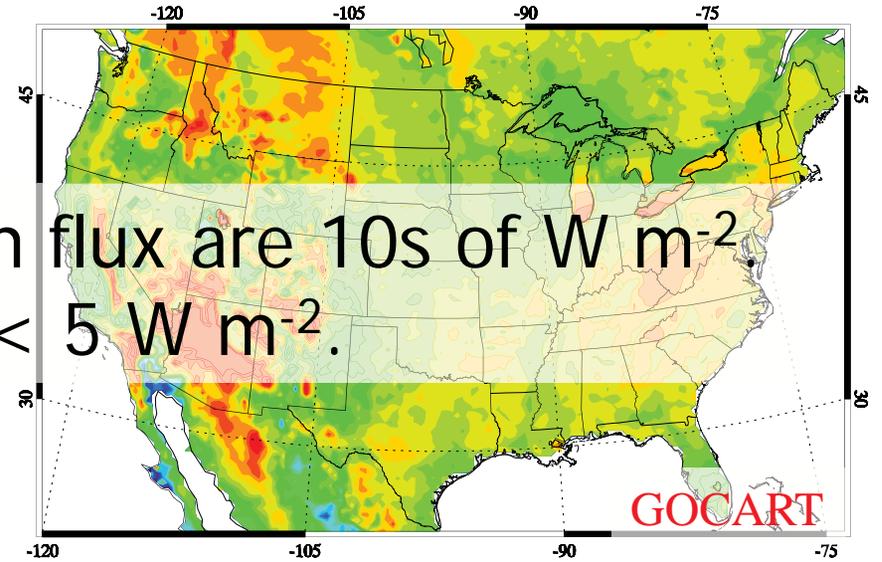


CWRF CTOAFlux 2002 cam5-ISCCP



NCAR CAM5

CWRF CTOAFlux 2004 gocart-ISCCP

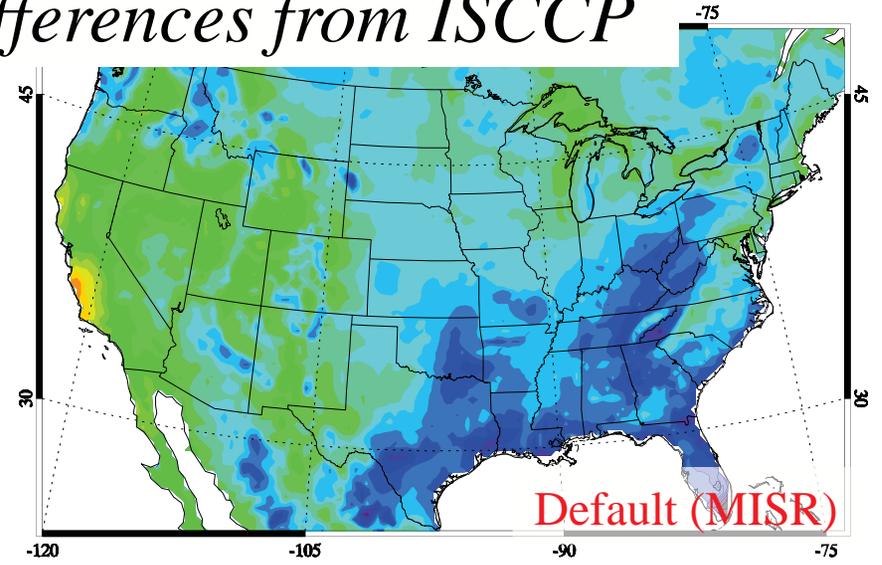
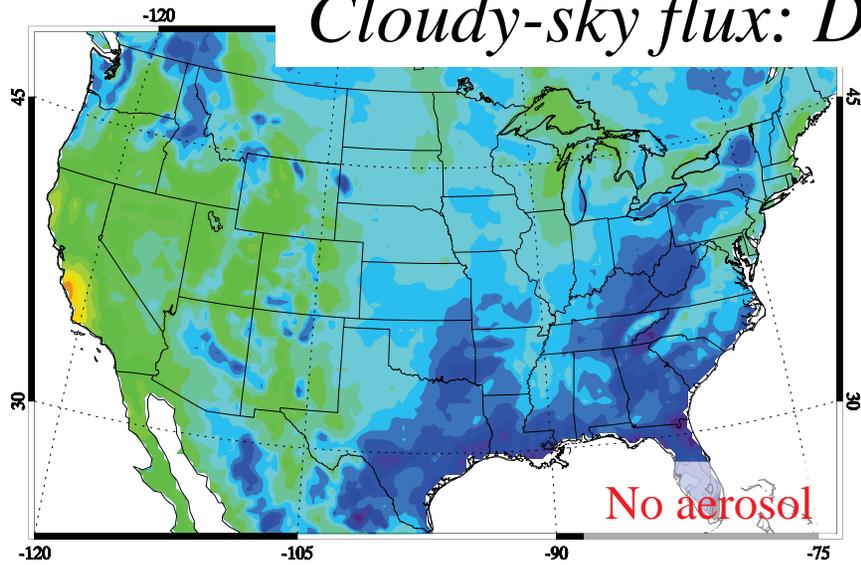


GOCART

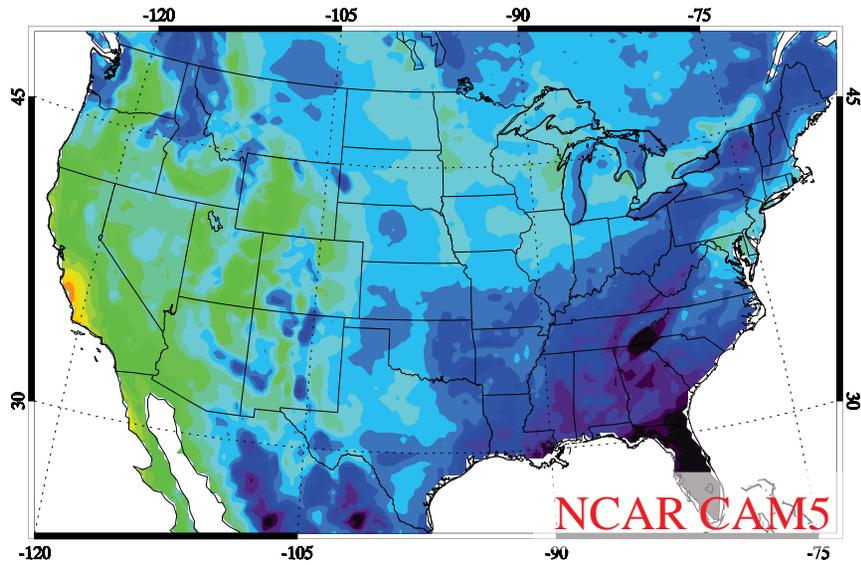


Note the scale. Errors in flux are 10s of  $W\ m^{-2}$ .  
Forcing is  $< 5\ W\ m^{-2}$ .

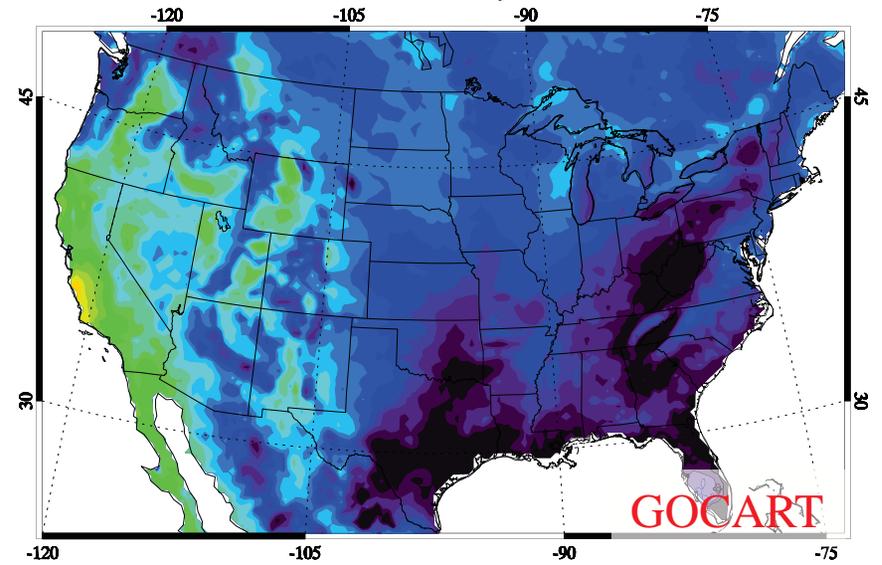
# Cloudy-sky flux: Differences from ISCCP



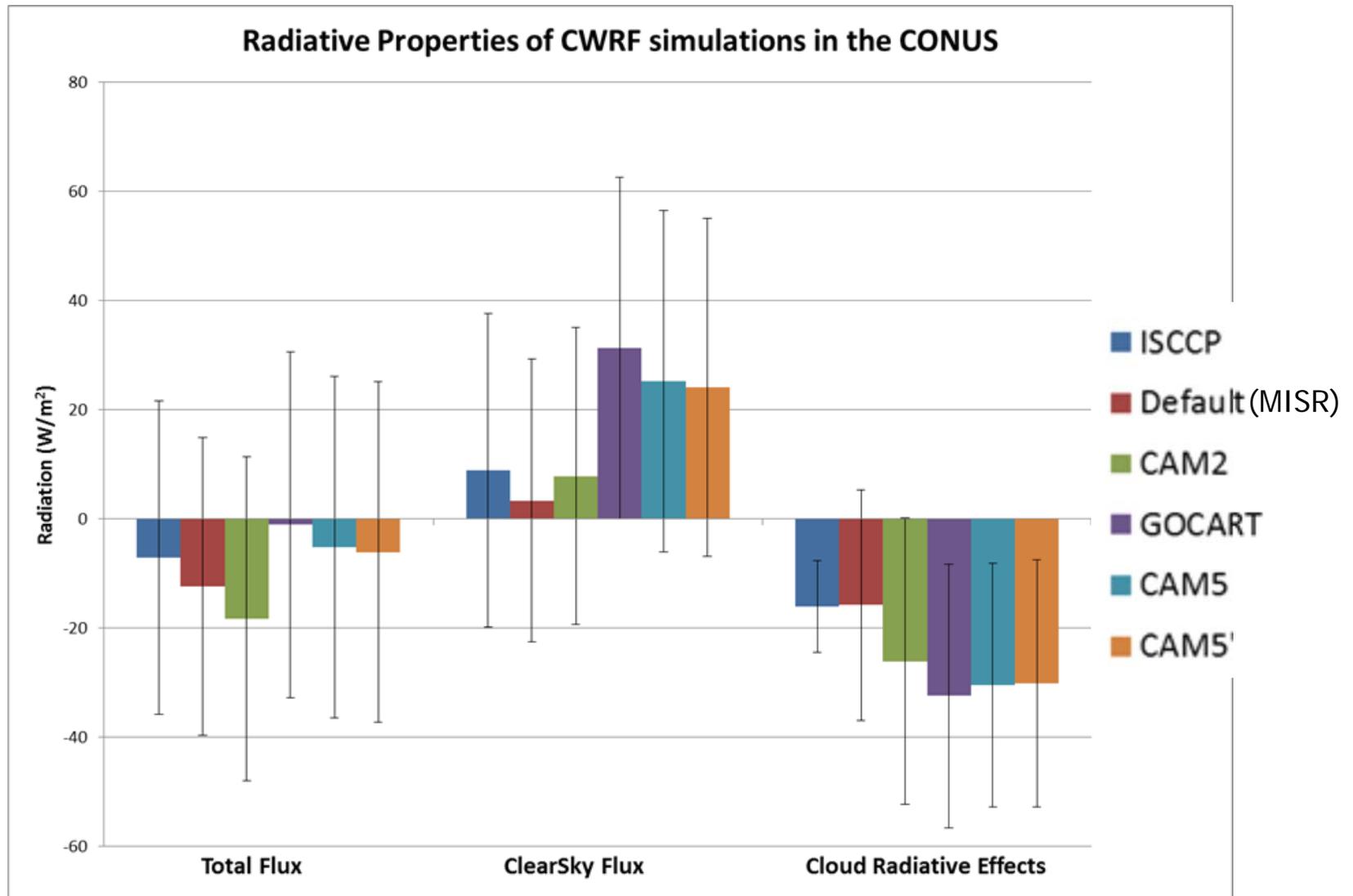
CWRF CldRE 2002 cam5-ISCCP



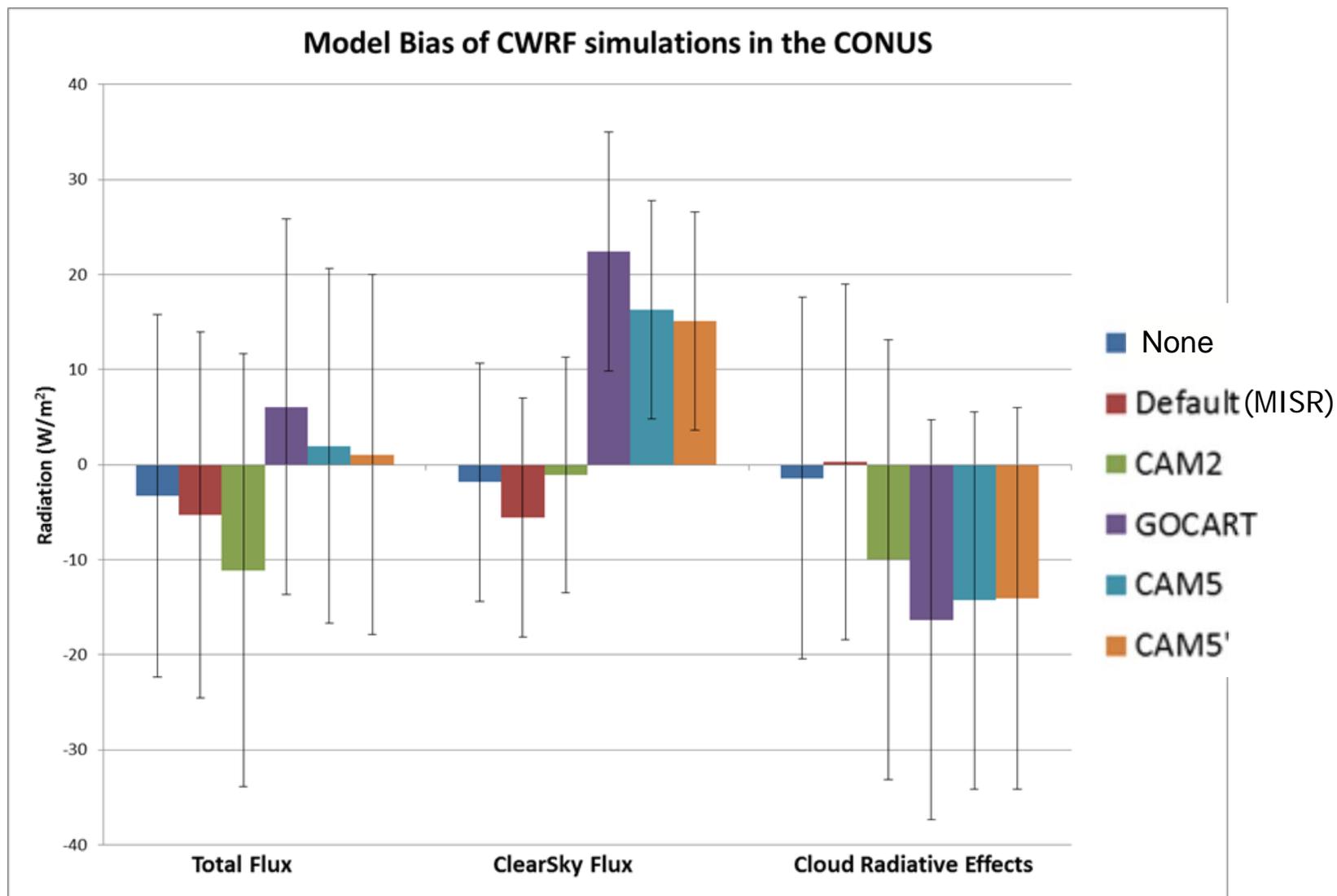
CWRF CldRE 2004 gocart-ISCCP



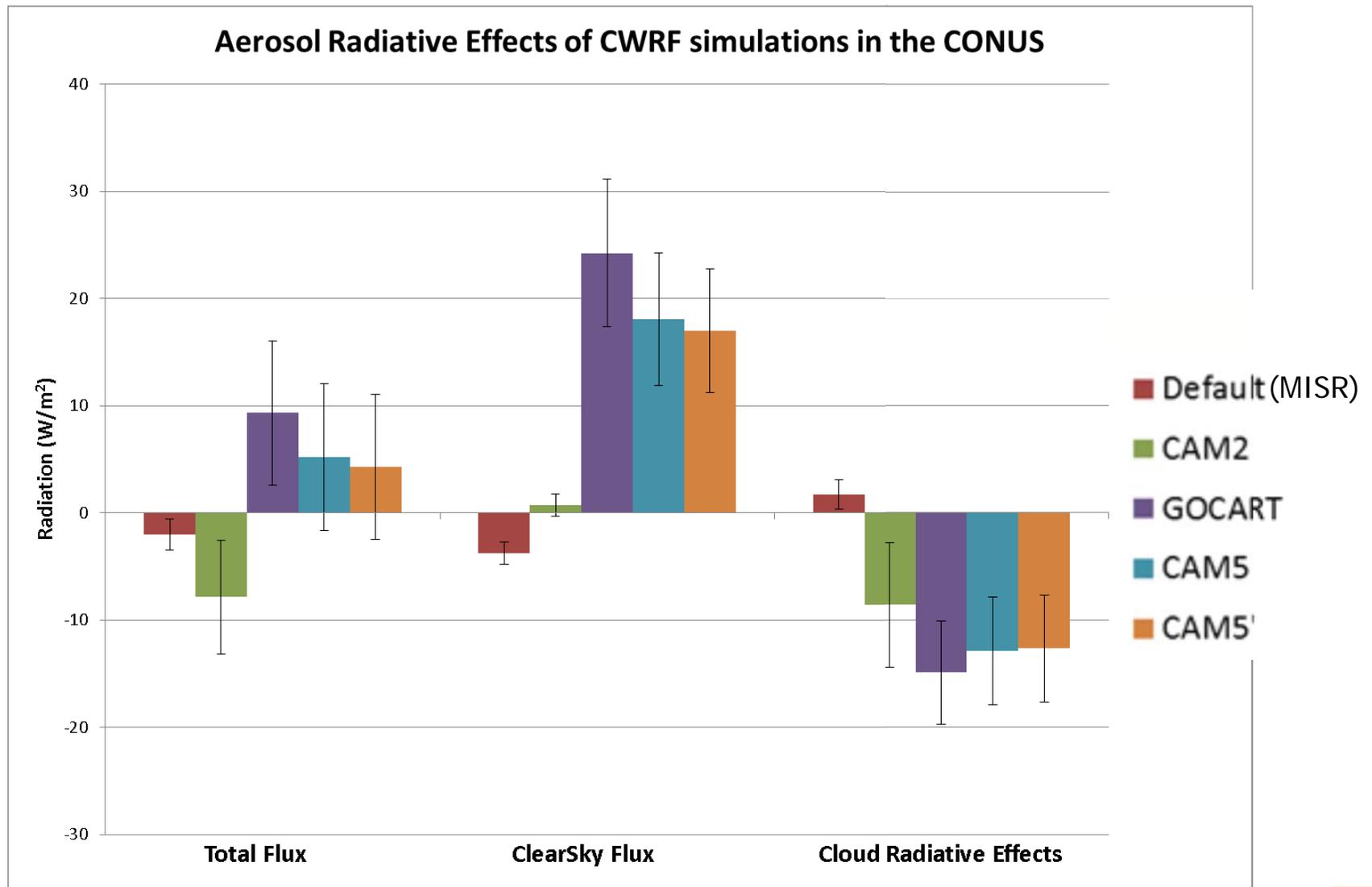
# Comparison between modeled and observed fluxes (average over Continental US) *Error bars are std dev of all grid boxes*



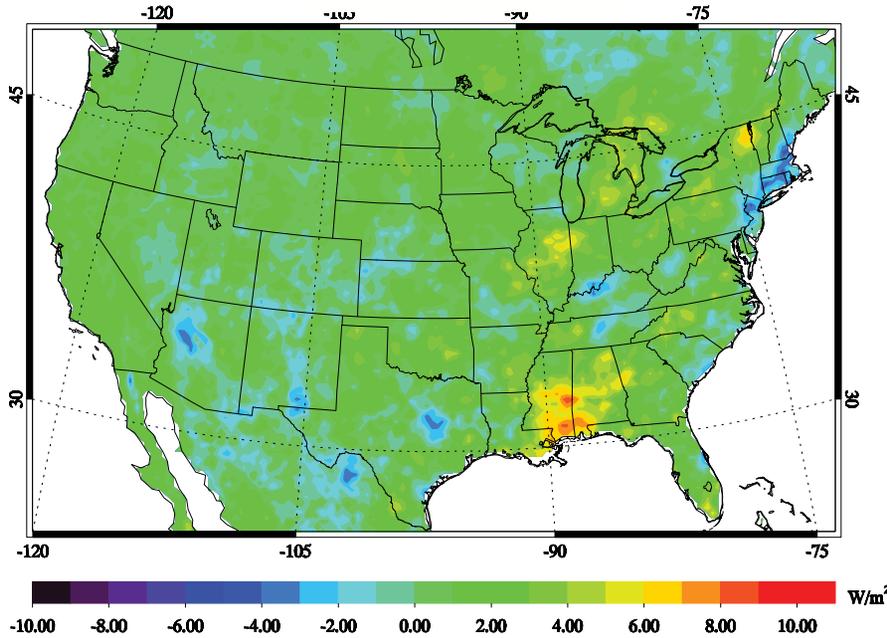
# Model bias: Difference between CWRF results and ISCCP



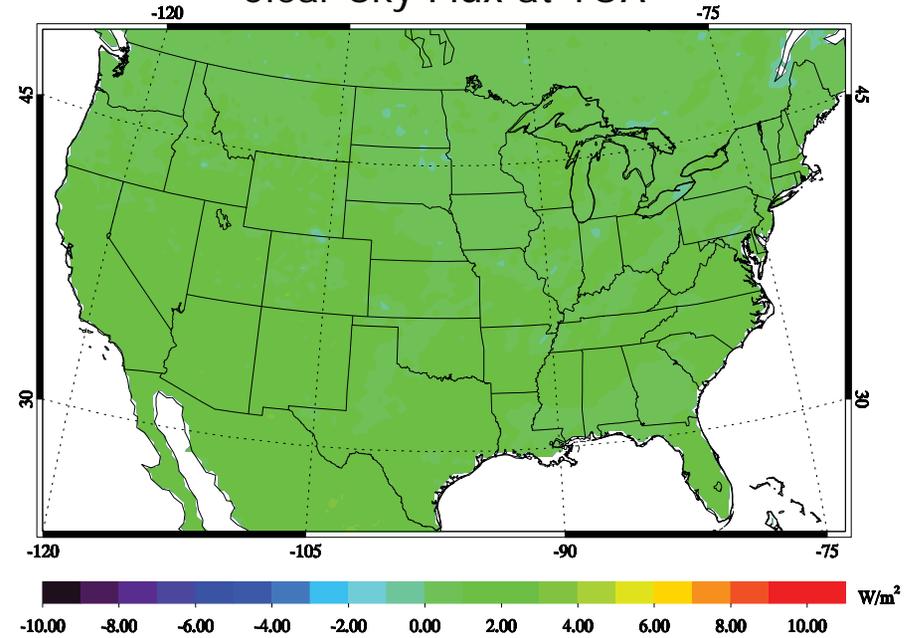
# Aerosol radiative effects: Difference between modeled results with & without aerosols



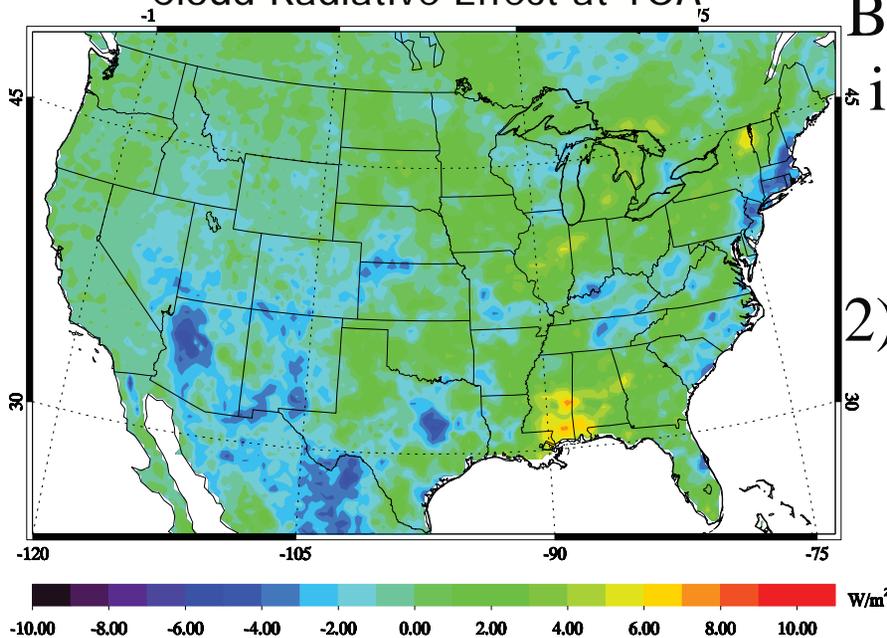
Total Flux at TOA



Clear Sky Flux at TOA



Cloud Radiative Effect at TOA



BC and OC partition have substantial impacts on the radiation simulations

- 1) Impacts on clear sky flux are uniform
- 2) Cloud radiative effects are large ( $\pm 5 \text{ W/m}^2$ ) and regionally dependent, for instance opposite effects are suggested in the southeast US and in the northwest US.

# Emission-to-forcing measures

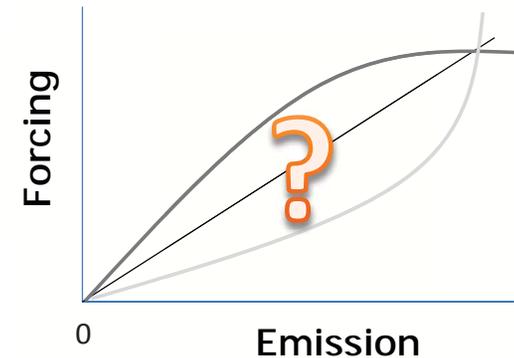
EMISSION-TO-FORCING MEASURES

*Or, Model Interpretation for Policy Relevance*

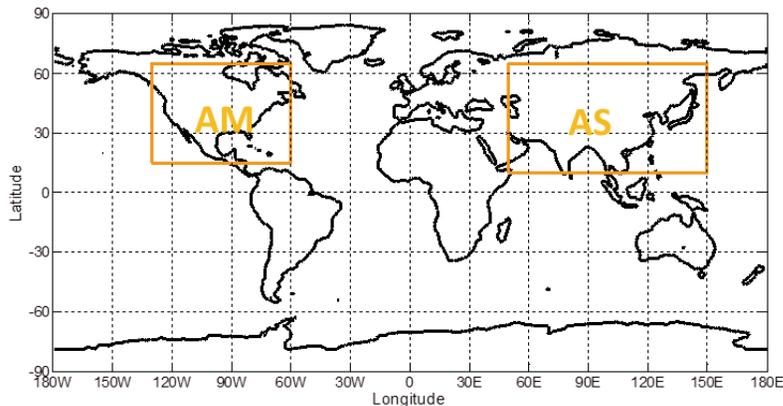
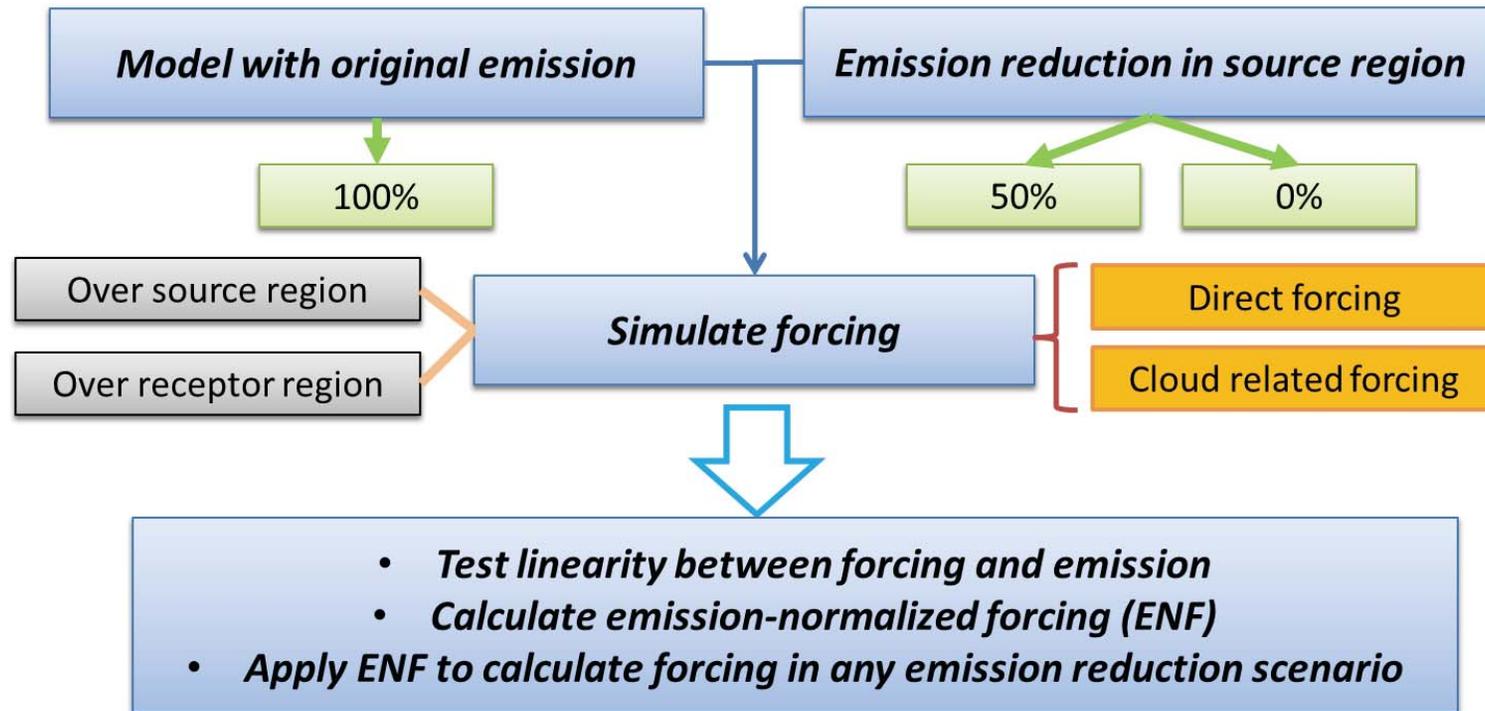
(Yanju Chen– Univ of Illinois)

# Step 1: Test linearity and regionality

- ❑ Basis to obtain forcing-per-emission relationship; assumed by emission metrics.
- ❑ Direct forcing – *probably* linear
- ❑ Cloud forcing – *may be* nonlinear with respect to aerosol concentration (Quaas et al., 2009)
- ❑ May vary by region



# Experimental Design

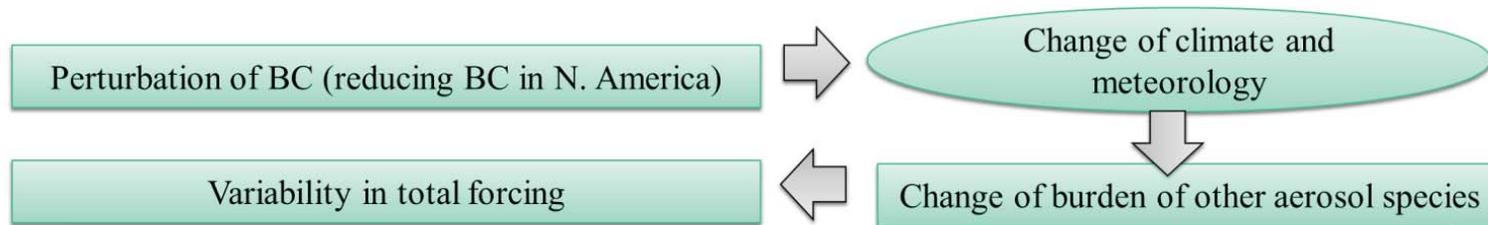


- ❑ Reduce BC from N. America (AM BC)
- ❑ Reduce BC from Asia (AS BC)
- ❑ Reduce OC from N. America (AM OC)
- ❑ Reduce OC from Asia (AS OC)

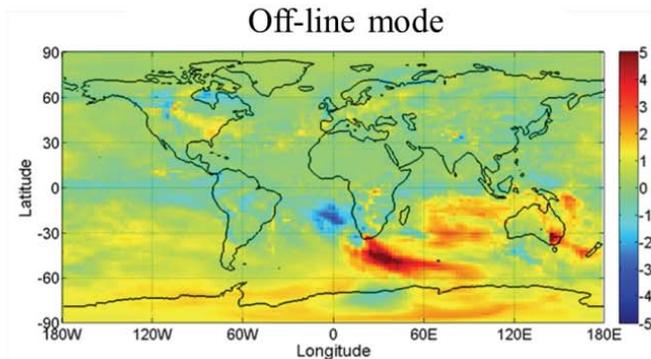
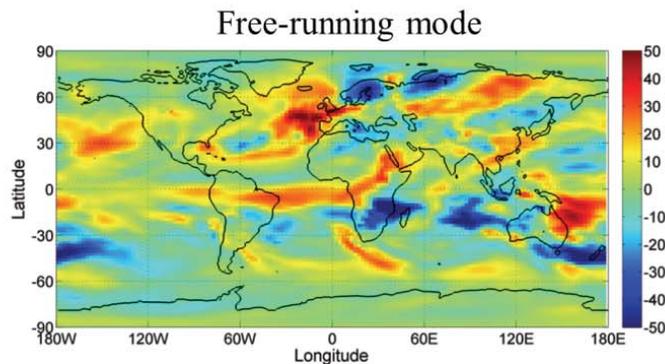
# Model Description and Configuration

- ❑ Modified Community Atmosphere Model (CAM5.1)
  - *Three-modal aerosol module (MAM3)* (Liu et al., 2012)
  - *Improved BC spatial and temporal distribution* with modified convective transport and wet removal
  - Tagged BC/OC emission for direct calculation of burden and forcing
- ❑ Anthropogenic emissions: from IPCC emission datasets for year 2000 (Lamarque et al., 2010).
- ❑ Model is configured to run in off-line mode (Ma et al, 2013)
  - Model reads in prescribed meteorological fields
  - Model driven by ERA-interim data
  - Semi-direct effect cannot be simulated
- ❑ Each simulation is run for 5 years with 2 months for model spin-up.

# Need for off-line meteorology



Percentage change of dust burden when reducing BC from N. America from 100% to 50%



- Direct forcing change is caused by *non-BC aerosols* (dust). ←
- Since cloud-related forcing is inferred from total flux change, it is obscured by dust changes.
- Dust needs to remain in the atmosphere, because it could also affect clouds.

# Linearity diagnostic for a single species

$$R = \frac{F_{100} - F_{50}}{F_{100} - F_0}$$

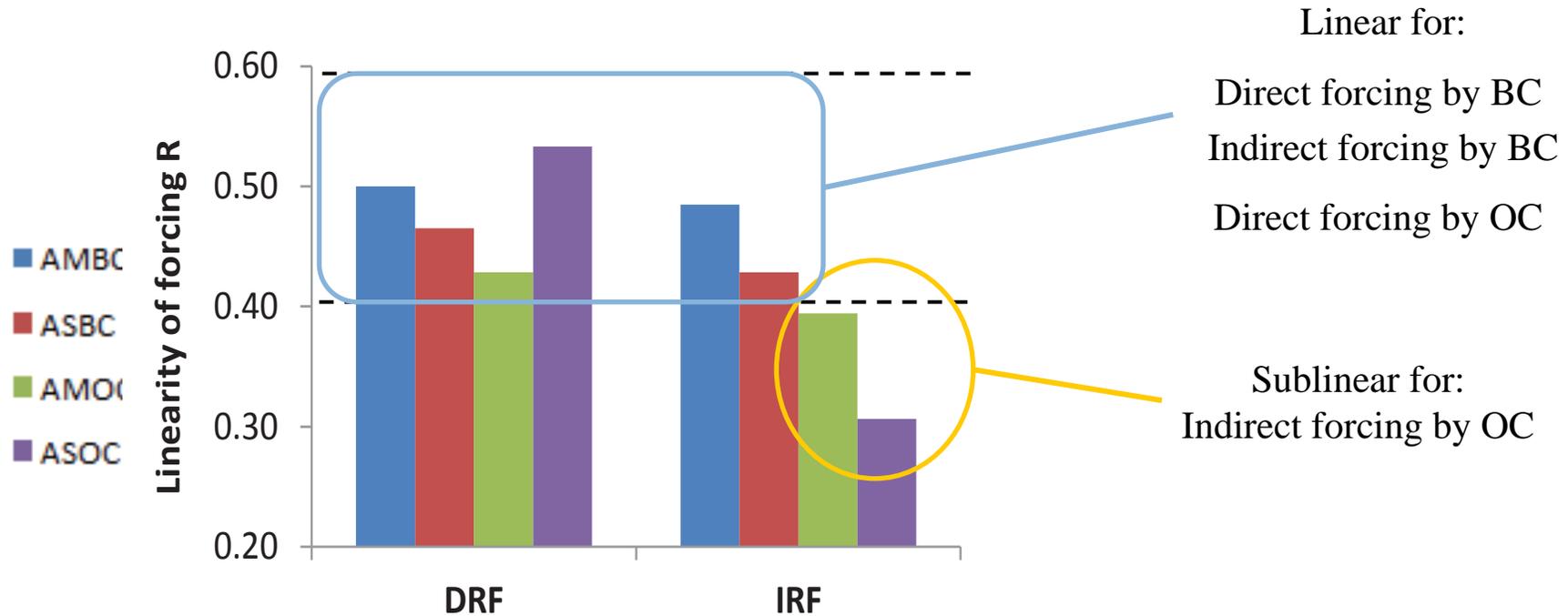
100% present-day emission →  $F_{100}$  ← 50% present-day emission

→  $F_{100}$  ← 0 emission

$R \cong 0.5$ : Forcing is linear in emission.

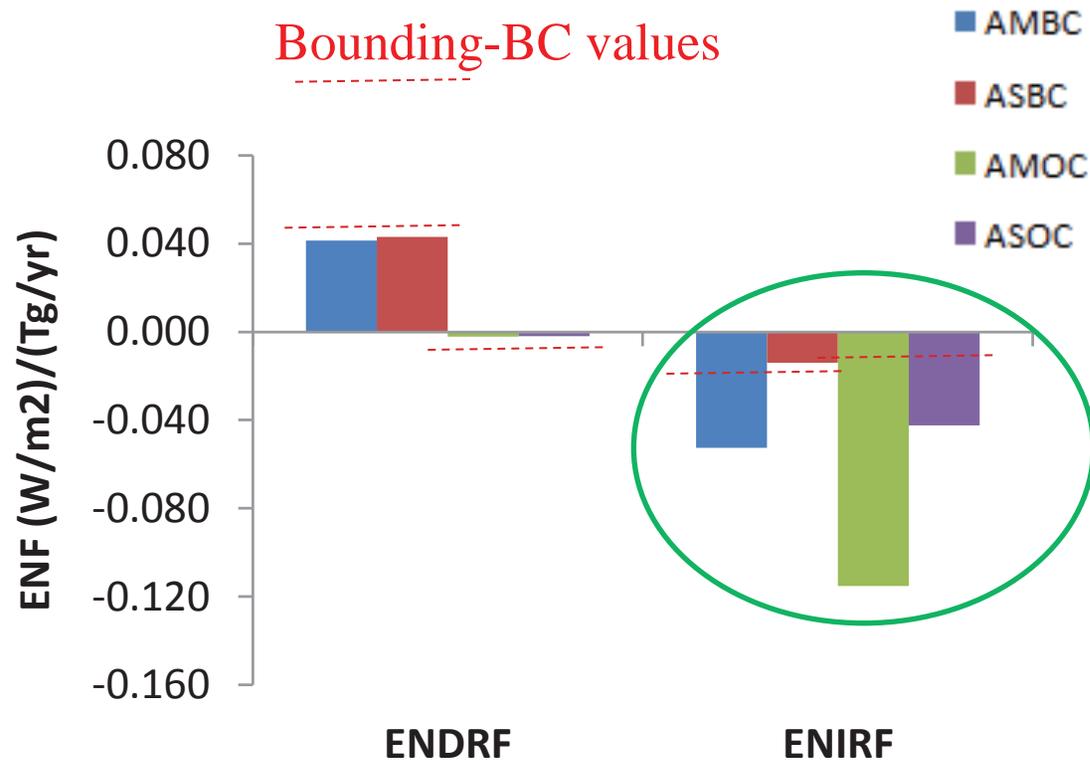
$R < 0.5$ : Small emission change from present-day produces *less forcing change* than one would expect

# Linearity of Global Mean Forcing



*2 regions: AM=North America; AS=Asia*

# Emission-normalized forcing



Indirect forcing, ENIRF:

3-4 times higher in N. America  
(not saturated)

Reducing same amount of BC/  
OC in these two regions will  
result in greatly different cloud  
change.

Direct radiative forcing,

ENDRF:

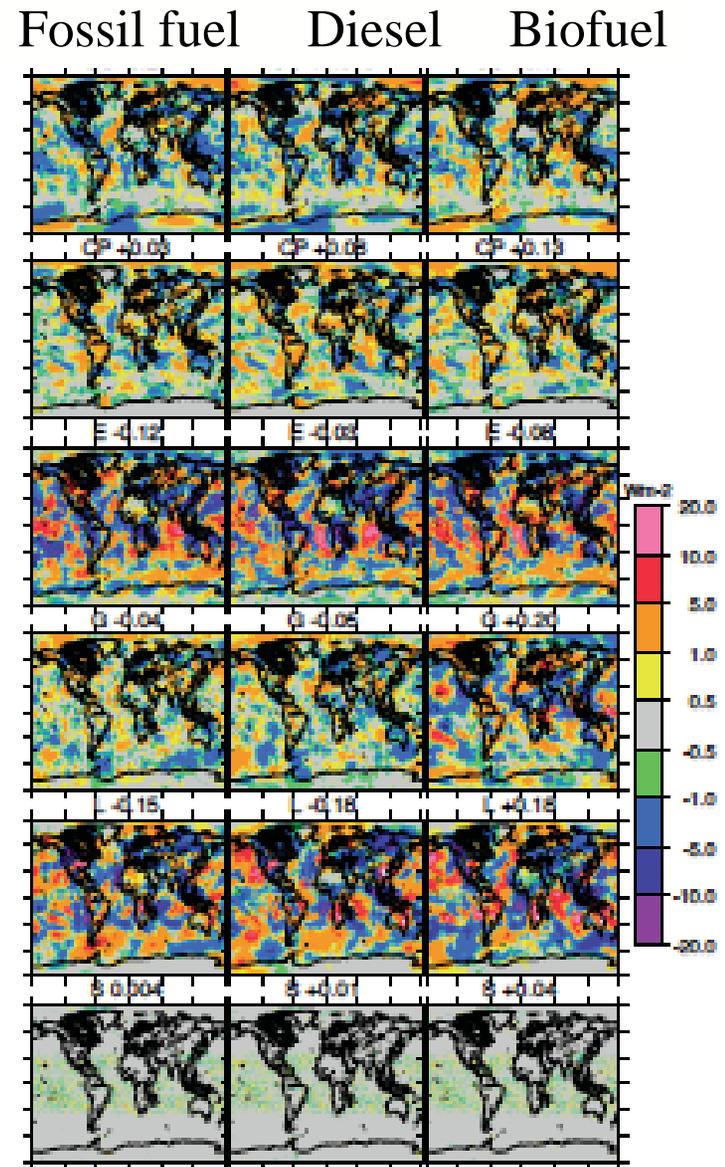
similar for N. America and Asia

# Is cloud forcing visible?

Multi-model study of effects on liquid clouds

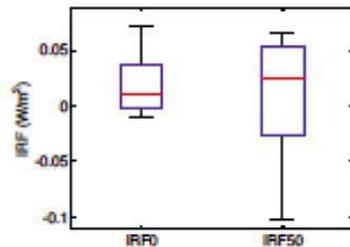
Each row is from a different model.

No forcing pattern visible.



# Regional Location of Indirect Forcing

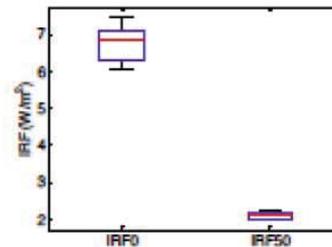
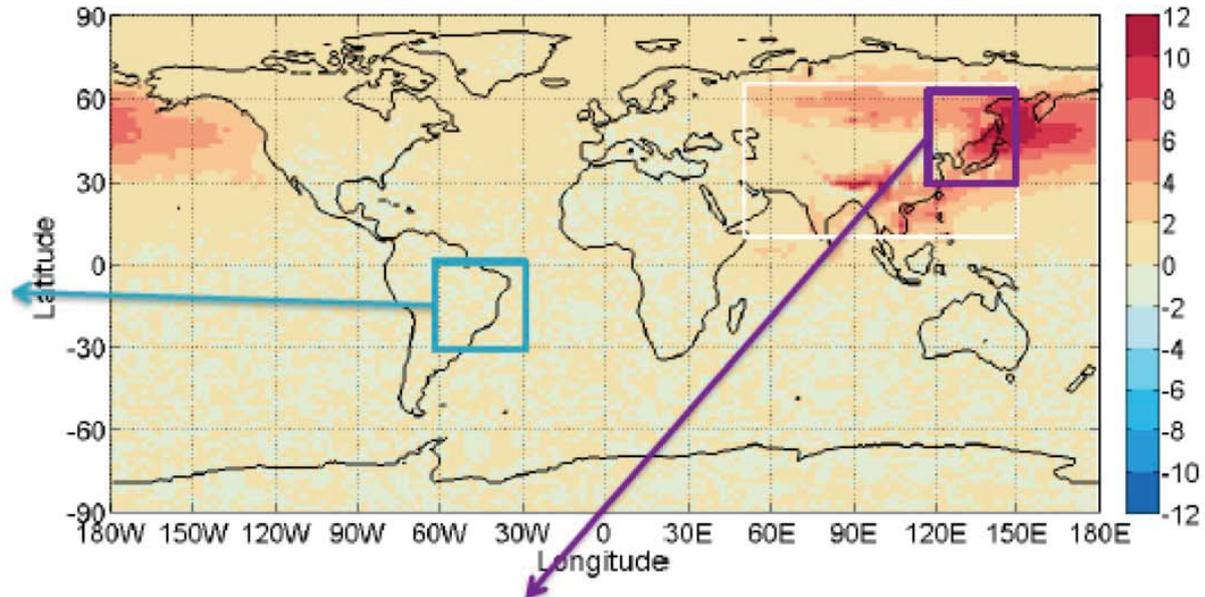
*Example: OC from Asia*



p value = 0.69

IRF0 and IRF50 are NOT significantly different considering interannual variability.

Region with noise



p value = 2.48e-5

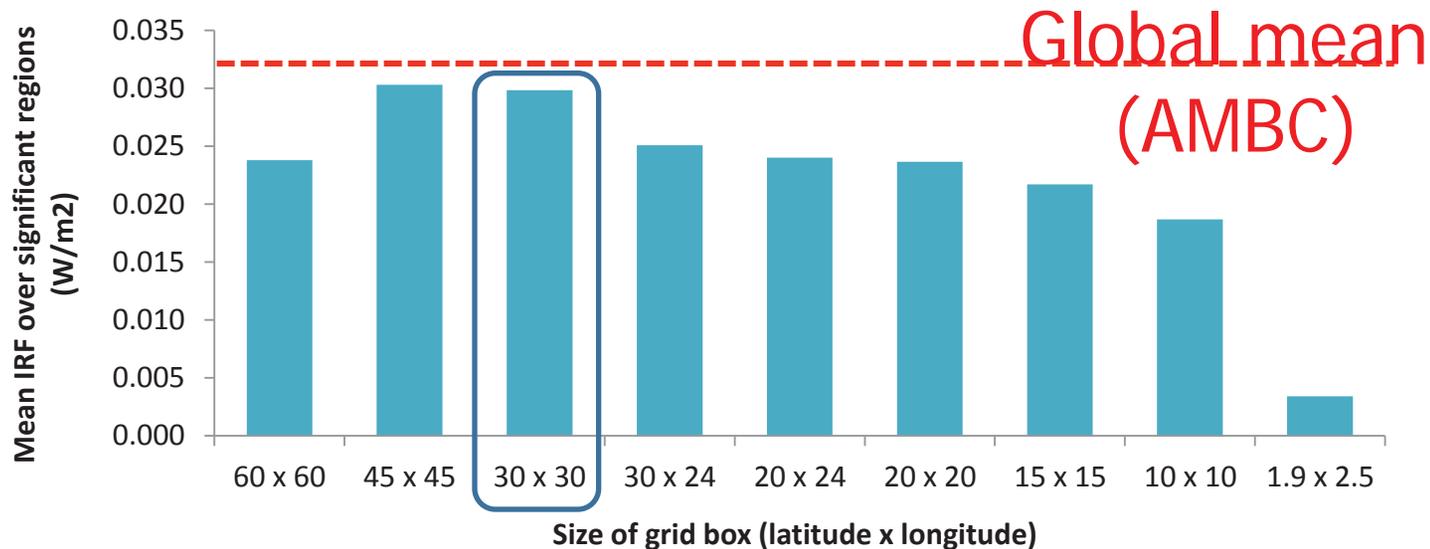
IRF0 and IRF50 ARE significantly different considering interannual variability

**Significant region!**

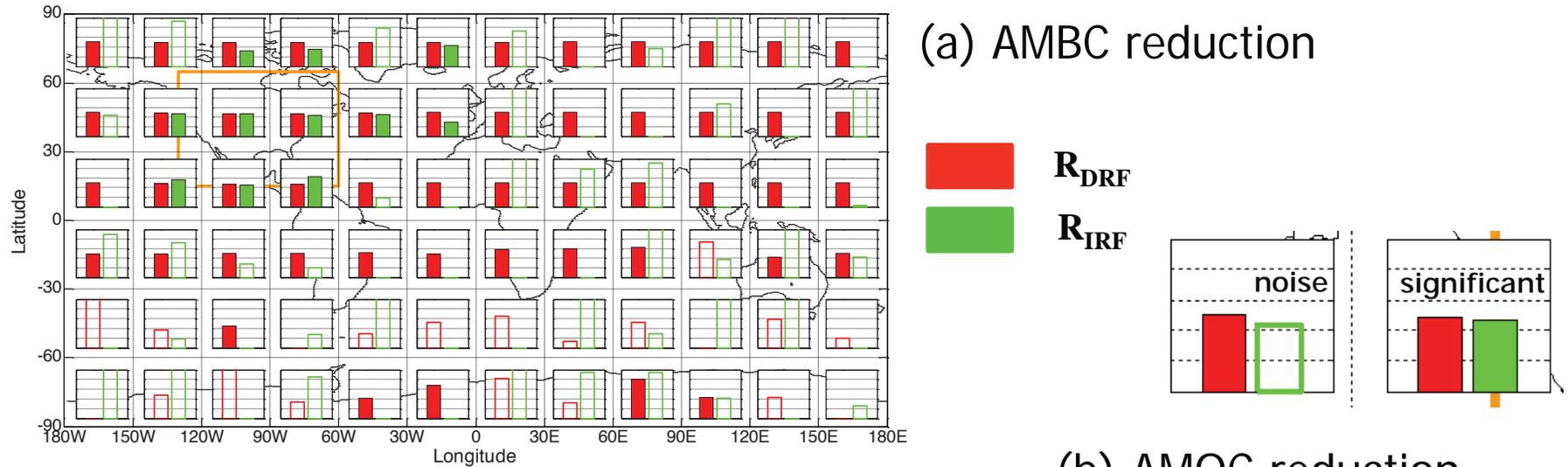
\* Significant region was statistically determined using paired t-test between IRF0, IRF50 and 0 at significance level  $\alpha = 0.1$

# Optimum grid box size for testing significance

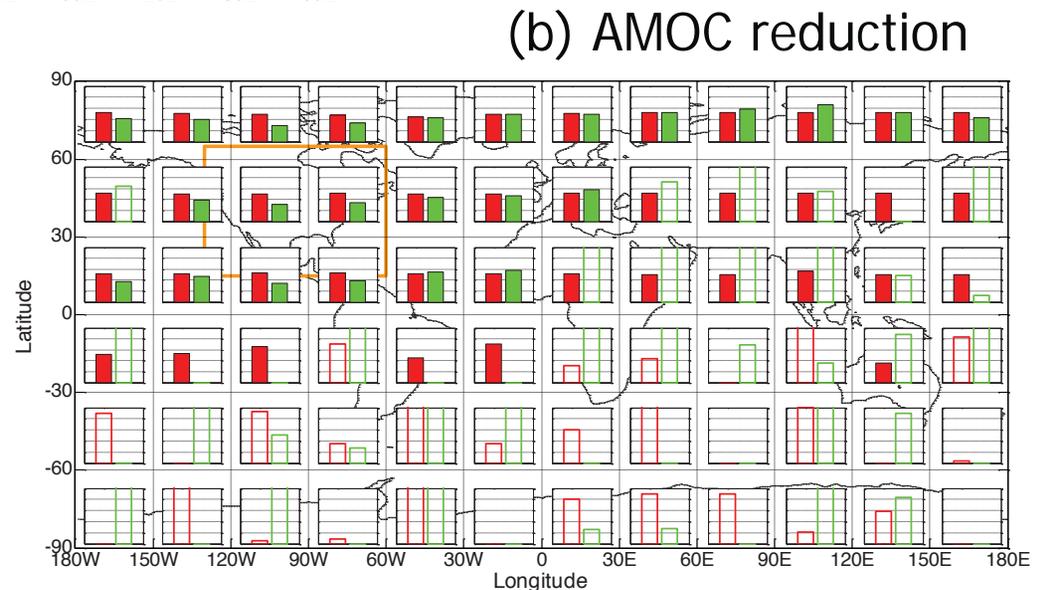
- Box too small: Each box noisy; few boxes significant
- Box too large: Includes regions with little impact; too few boxes are significant
- $30^\circ \times 30^\circ$  is optimum
- Significant grid boxes equal global mean forcing; the rest are noise



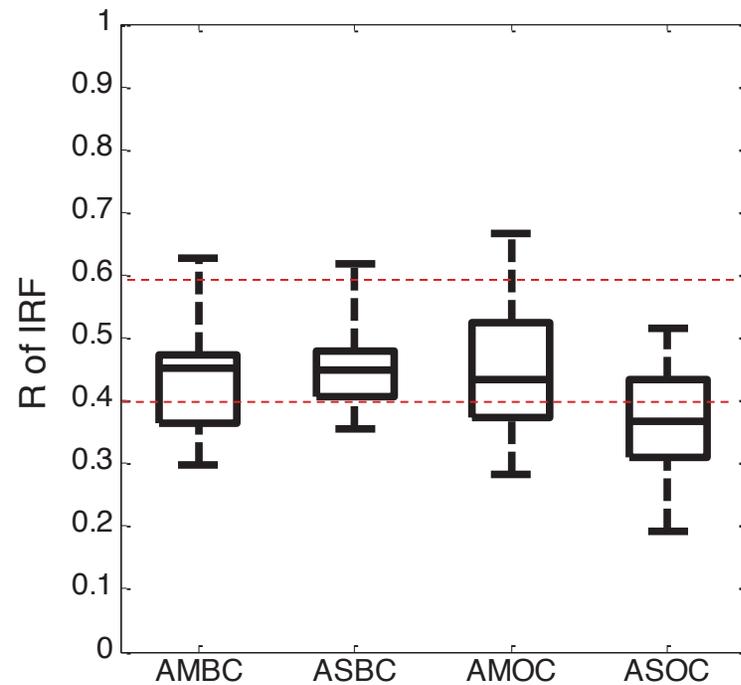
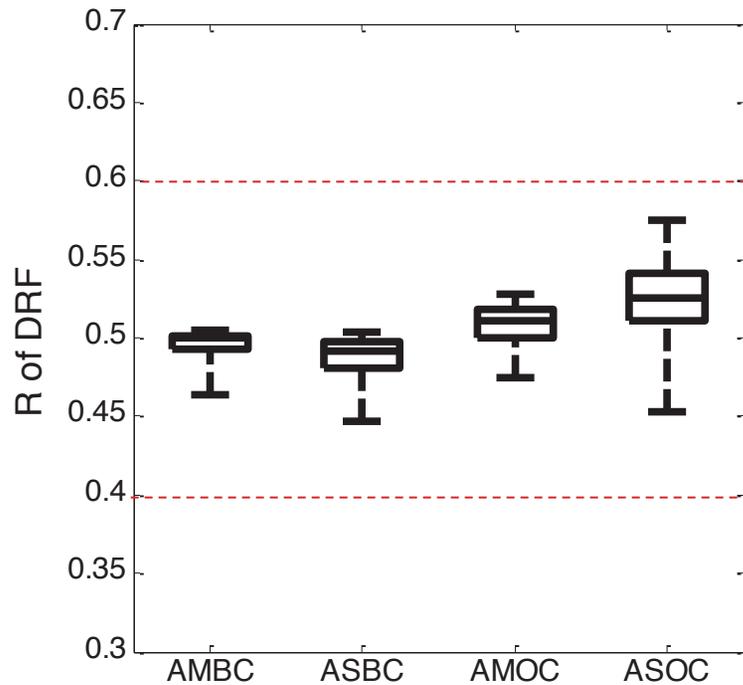
# Radiative Forcing in Significant Regions



- Only 20-30% of the grid boxes are significant
- Near and downwind of source region



# Linearity in Significant Regions

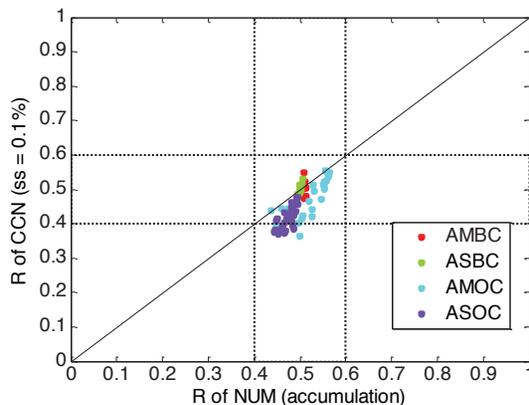


- Direct radiative forcing (DRF) is linear in all regions
- Indirect radiative forcing (IRF) is nonlinear in some significant regions, especially for OC

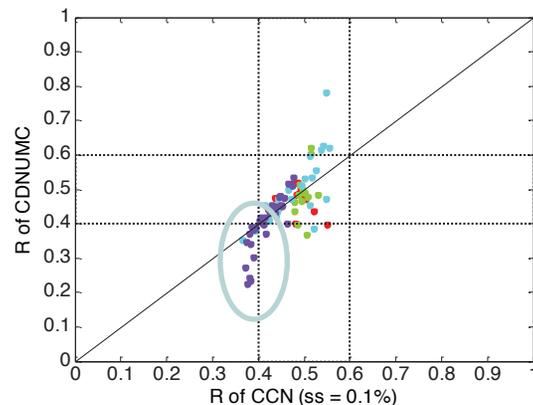
# Cause of Nonlinearity

Emission → CN → CCN → droplet (CDNUMC) → IRF

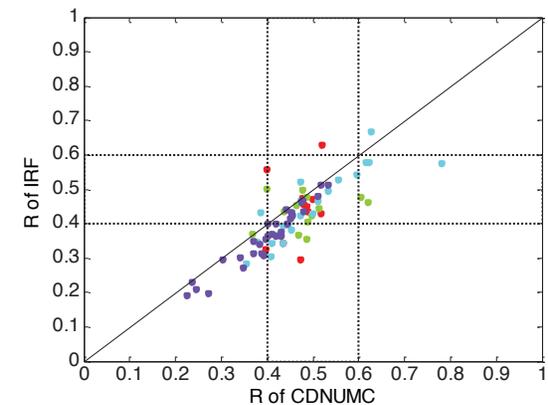
linear



nonlinear



linear



- Nonlinearity occurs when cloud droplets are formed from CCN.
- Formation of droplets is limited, and does not increase as the number of CCN increases.
- Of course, this depends on model parameterization...

# Summary – Indirect forcing

- ❑ Apparent effect on clouds– ENIRF:  
N Am OC > N Am BC > Asian OC > Asian BC
- ❑ In high-aerosol regions, reducing present-day aerosol has a *less-than-linear* effect
- ❑ Global average forcing can be attributed to a subset (<40%) of significant regions

However, comparison with observations calls modeling of aerosol-cloud effect in North America into question

*Next– Compare global & regional aerosol effect in North America*

# Policy-relevant metrics

*Or, Get the Story Right*

(Praveen Amar, Danielle Meitiv– Clean Air Task Force  
presented by Tami)

# Original goal: Communicate with policy makers to see what metrics they want

<b>Professional Roles</b>	<b>Number of Interviewees</b>	<b>Percentage of Total</b>
Academic – Climate Policy/Science	3	9
Air Quality Management – State Level	7	20
Air Quality Management – Federal Level	11	31
Federal – Climate Policy/Science	5	14
NGO – Air Quality Advocacy	3	9
NGO – Climate Advocacy	6	17

**Table 1. Professional roles and expertise of the interviewees and their percentage of the total pool of interviewees.**

*“Communicating the science and policy implications of black carbon” – CATF report*

# Main messages had nothing to do with metrics

- ❑ Scientists need understandable ways to communicate black carbon's effects to non-specialists
  - Even terms like “radiative forcing” and “feedback” are not as straightforward as you think.
- ❑ People want to hear about certainty, not uncertainty.

# Main messages had nothing to do with metrics

- ❑ Equating BC and CO<sub>2</sub>: Some are wary; in other situations (e.g. California) it's required.
  - People do not want to think about time horizons. That's our job.
  - People do not want to think about metrics. Ditto.
- ❑ There is not yet a good way to communicate immediacy of forcing changes.
  - Watch this space

# Summary of outcomes – easy ones

1: Size-resolved inventory complete.

4: Metrics are up to us. Make it easy.

# Summary of outcomes – hard ones

2: The constraint problem: Looking to confirm small changes (forcing) in a large signal (clouds).

3a: Forcing is nearly linear in emission, if regions are treated individually.

- Average over statistically significant (30x30) boxes.
- High-aerosol regions have lower indirect forcing per emission. More promising to reduce there.

3b: Cloud models don't match observations.

- Reason to doubt emission-to-forcing is not the model's nonlinear nature, but its inability to match reality.

Done. Questions?

# *Supplemental slides*

# Radiative flux in CWRF

We calculated, total radiative flux @ TOA (TOAFlux), clear sky flux @ TOA (CTOAFlux) and cloud radiative effect (CldRE) as:

$$\begin{aligned} \text{TOAFlux} &= \text{SW}_{\text{down,TOA}} + \text{LW}_{\text{down,TOA}} - \text{SW}_{\text{up,TOA}} - \text{LW}_{\text{up,TOA}} \\ \text{CTOAFlux} &= \text{SW}_{\text{down,TOA,clear}} + \text{LW}_{\text{down,TOA,clear}} - \text{SW}_{\text{up,TOA,clear}} - \\ &\quad \text{LW}_{\text{up,TOA,clear}} \\ \text{CldRF} &= \text{TOAFlux} - \text{CTOAFlux} \end{aligned}$$

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- ❑ Zhang, F., X.-Z. Liang, Q. Zeng, Y. Gu, and S. Su, 2013: Cloud-Aerosol-Radiation (CAR) ensemble modeling system: Overall accuracy and efficiency. *Advances in Atmospheric Sciences*, **30**, 955-973.