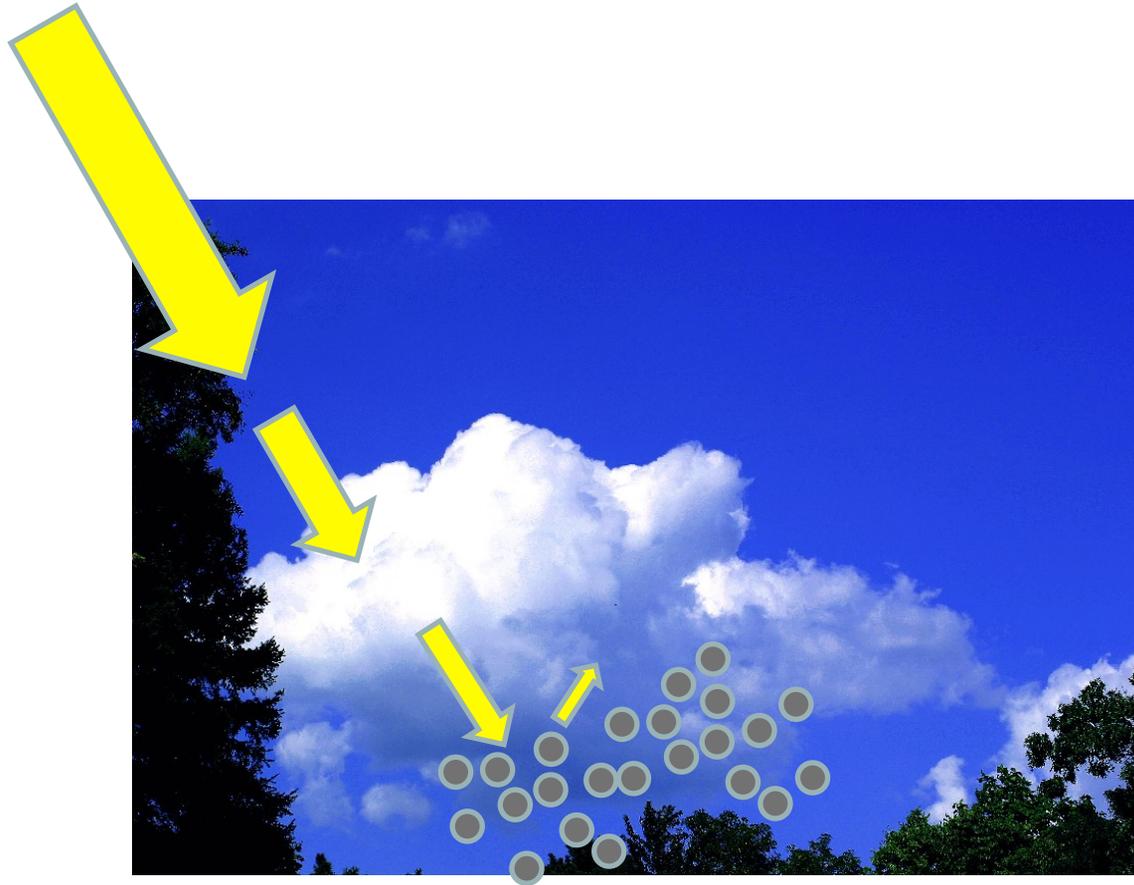
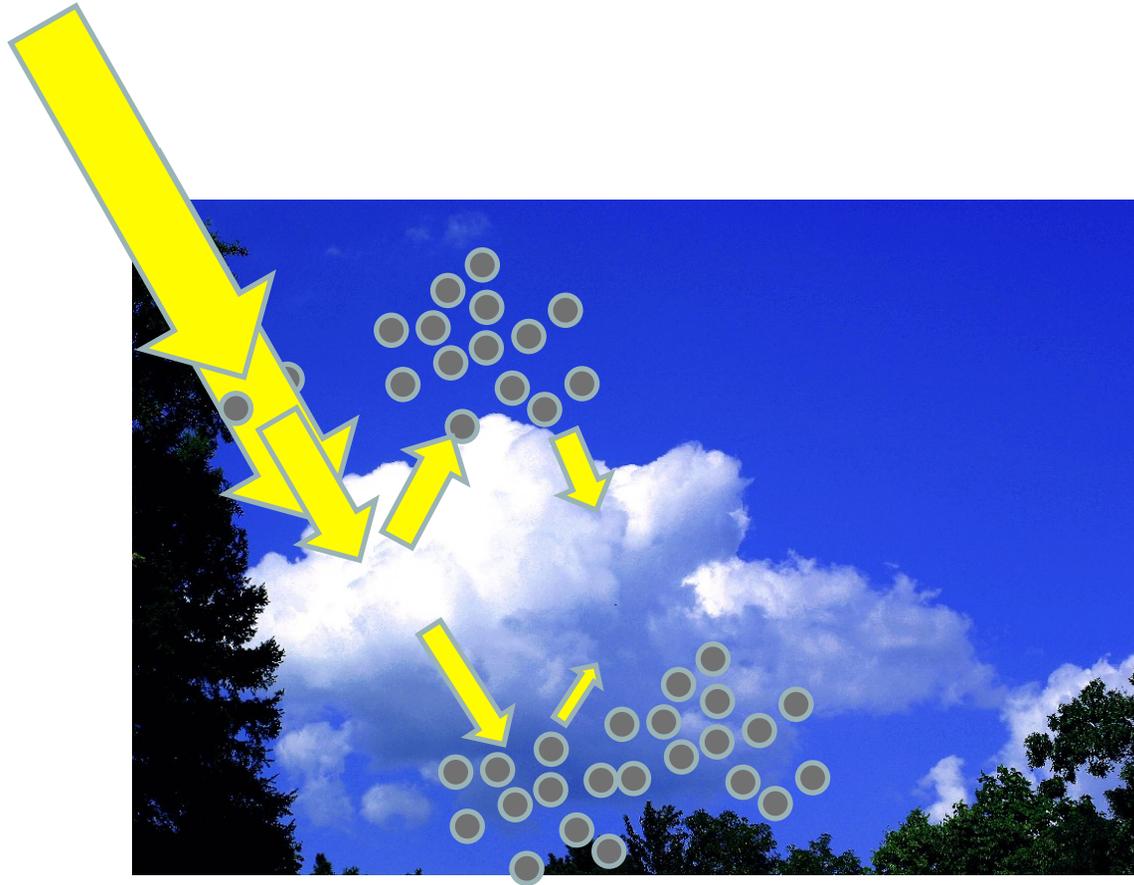




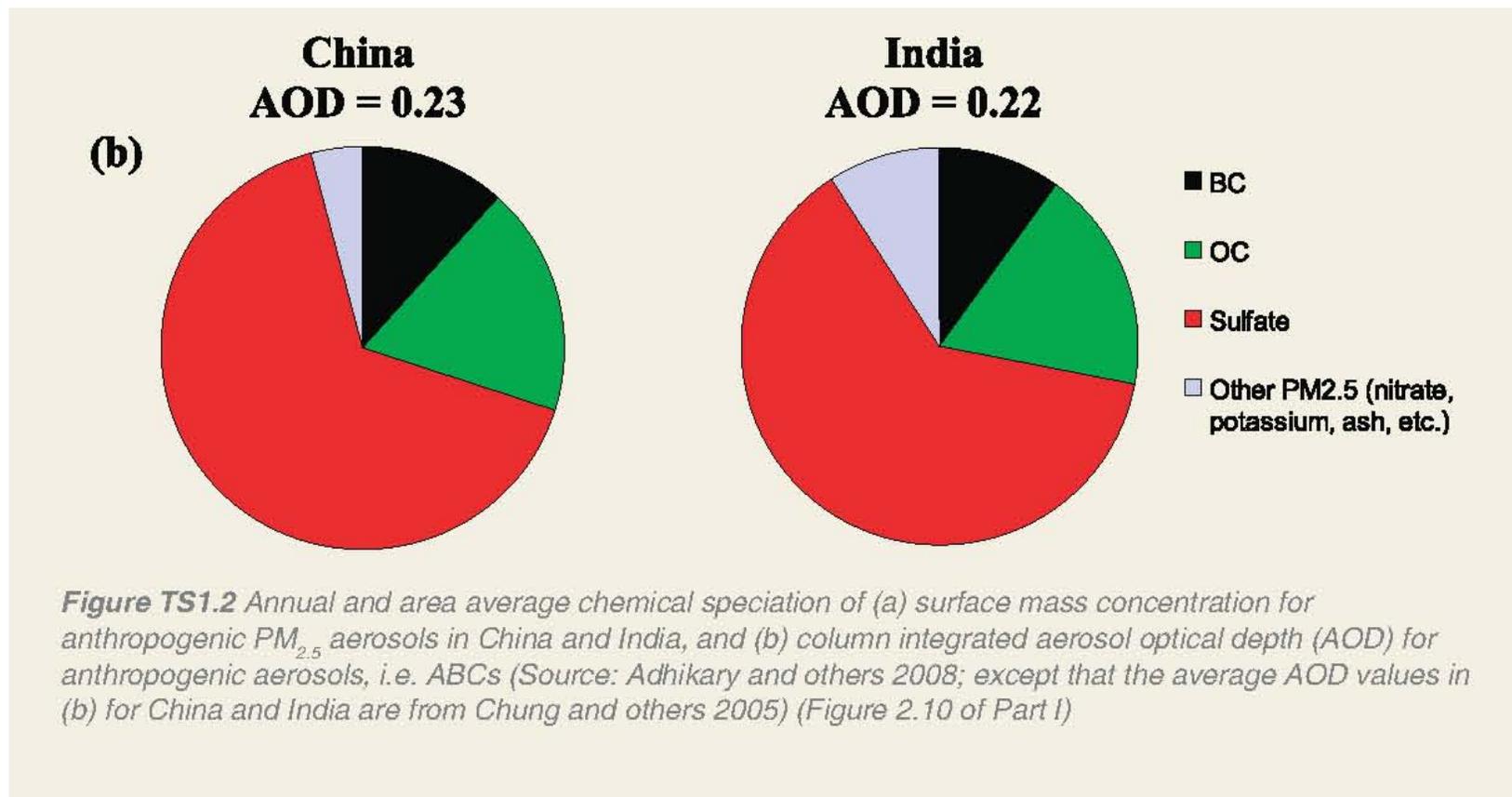
# Improved prediction of the vertical profile of atmospheric particulate carbon: development and evaluation of WRF-CMAQ

Annamarie G. Carlton





aerosols above clouds: diffuse backscatter, less removal processes



Sulfate > organic “brown” carbon > black carbon > nitrate and others

UNEP, Atmospheric Brown Clouds, Regional Assessment Report (2008)

“**Brownish**” color of ABCs assumed to arise *via* absorption by BC particles.

**Black Carbon:** colloquially means “soot”, highly light-absorbing carbon

**Elemental Carbon:** chemically refers to thermally-refractory pure carbon with a graphitic structure

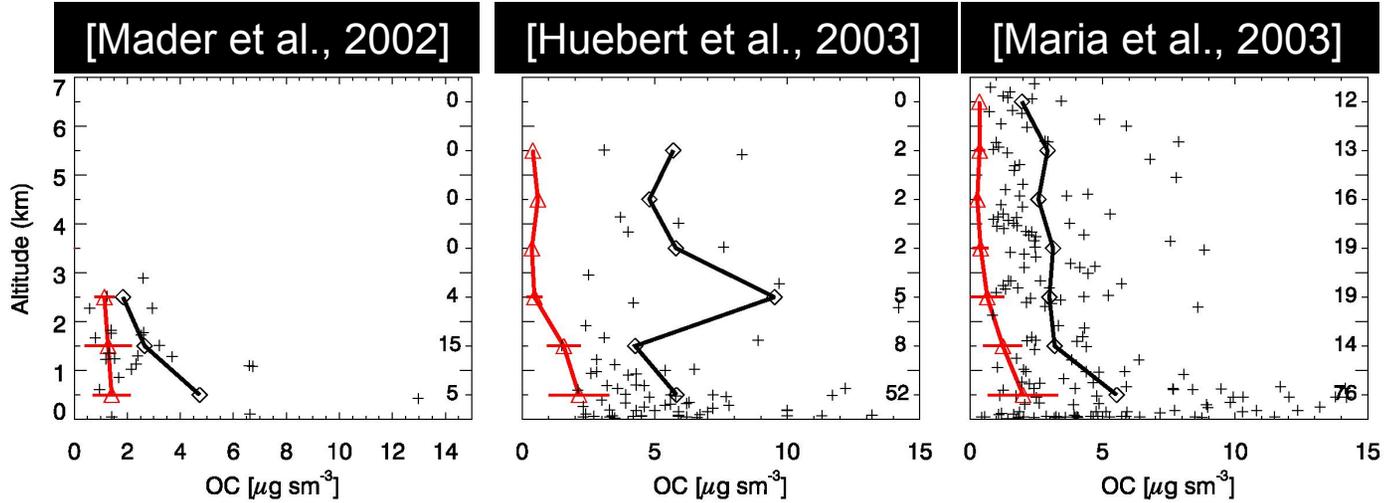
In CMAQ, Black Carbon contains elemental carbon and organic carbon, both absorbs and scatters UV and visible radiation

	Thermochemical Classification	Molecular Structure	Optical Classification
↑ Refractiveness	<b>Elemental Carbon (EC)</b>	<i>Graphene Layers (graphitic or turbostratic)</i>	<b>Black Carbon (BC)</b>
	<b>Refractory Organics</b>	<i>Polycyclic Aromatics, Humic-Like Substances, Biopolymers, etc.</i>	<b>Colored Organics</b>
	<b>Non-Refractory Organics (OC)</b>	<i>Low-MW Hydrocarbons and Derivatives (carboxylic acids, etc.)</i>	<b>Colorless Organics (OC)</b>
			↑ Specific Absorption

Separation based on single wavelength measurements (adapted from Pöschl, 2003).

ambiguity and arbitrariness to the separation of “BC” from organic or “**brown**”

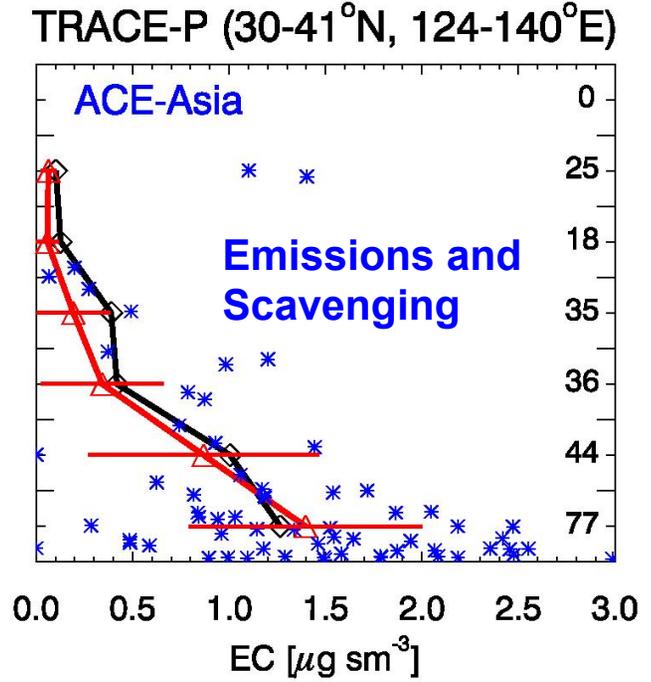
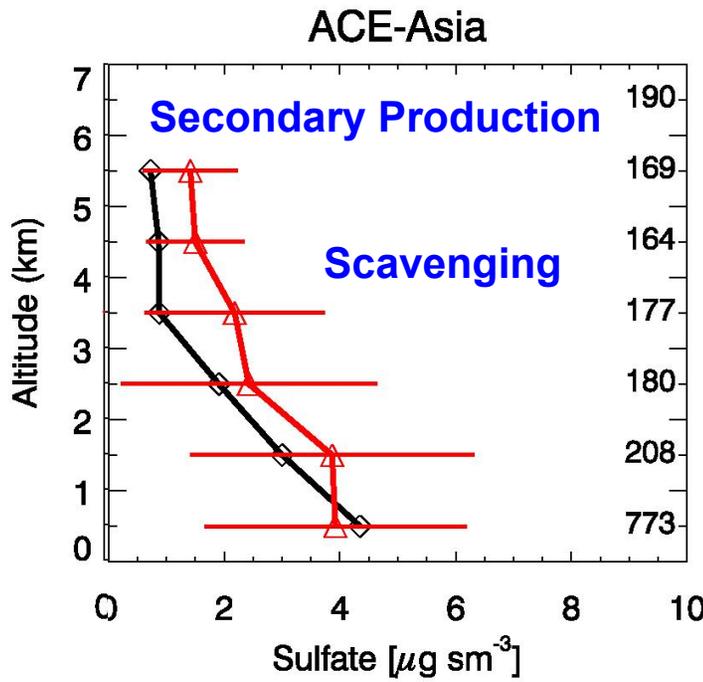
**black** dilutes to **gray** not **brown**



[Heald et al., 2005]

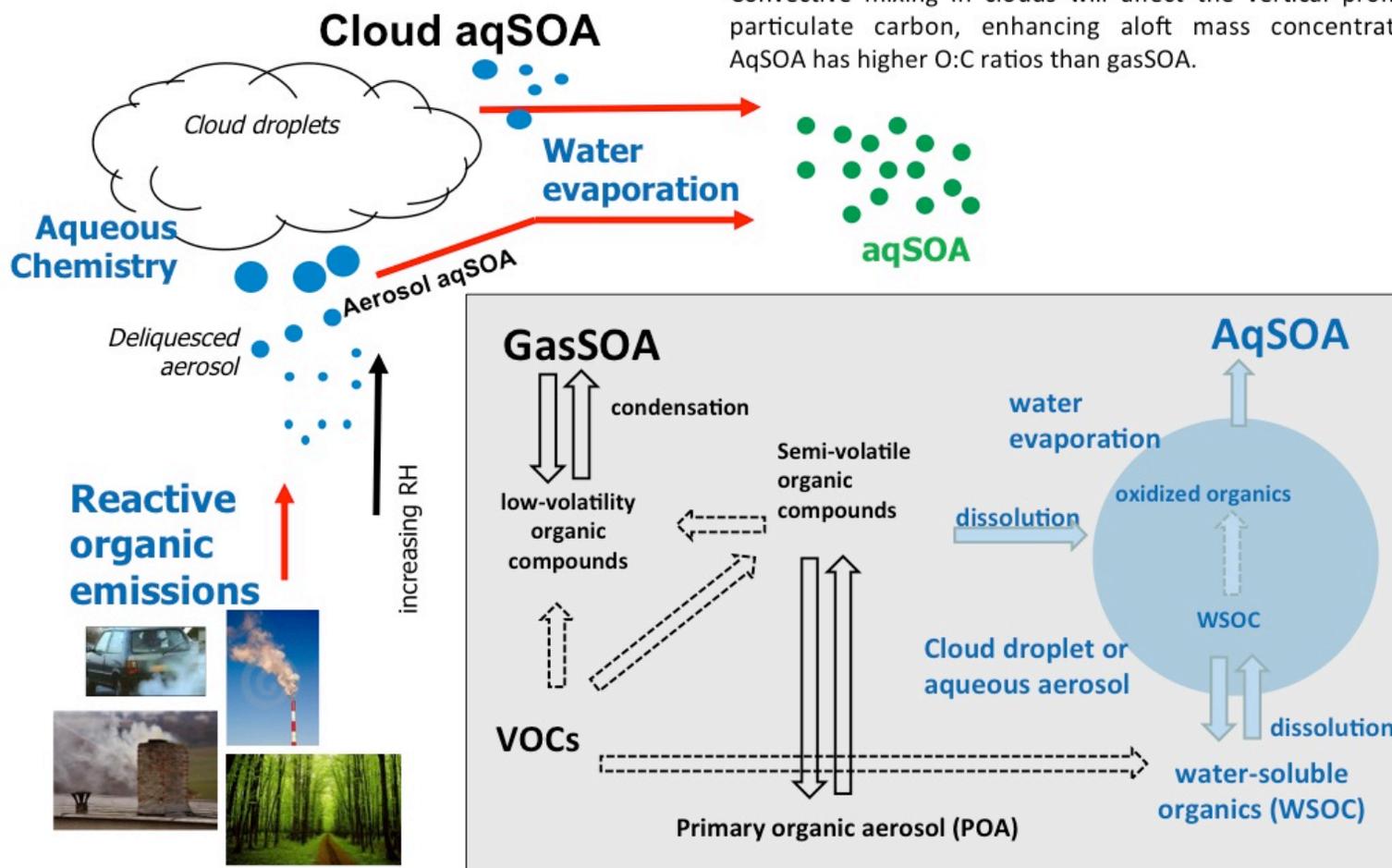


Vertical profile of OC is more like  $\text{SO}_4$  (produced in clouds) than Elemental Carbon (surface emissions)



- Mean Observations
- Mean Simulation
- + Observations

Convective mixing in clouds will affect the vertical profile of particulate carbon, enhancing aloft mass concentrations. AqSOA has higher O:C ratios than gasSOA.



Adapted from Ervens et al., 2011



Aqueous lab experiments with methylglyoxal form low volatility brown material. Figure courtesy of V.F. McNeill, Columbia

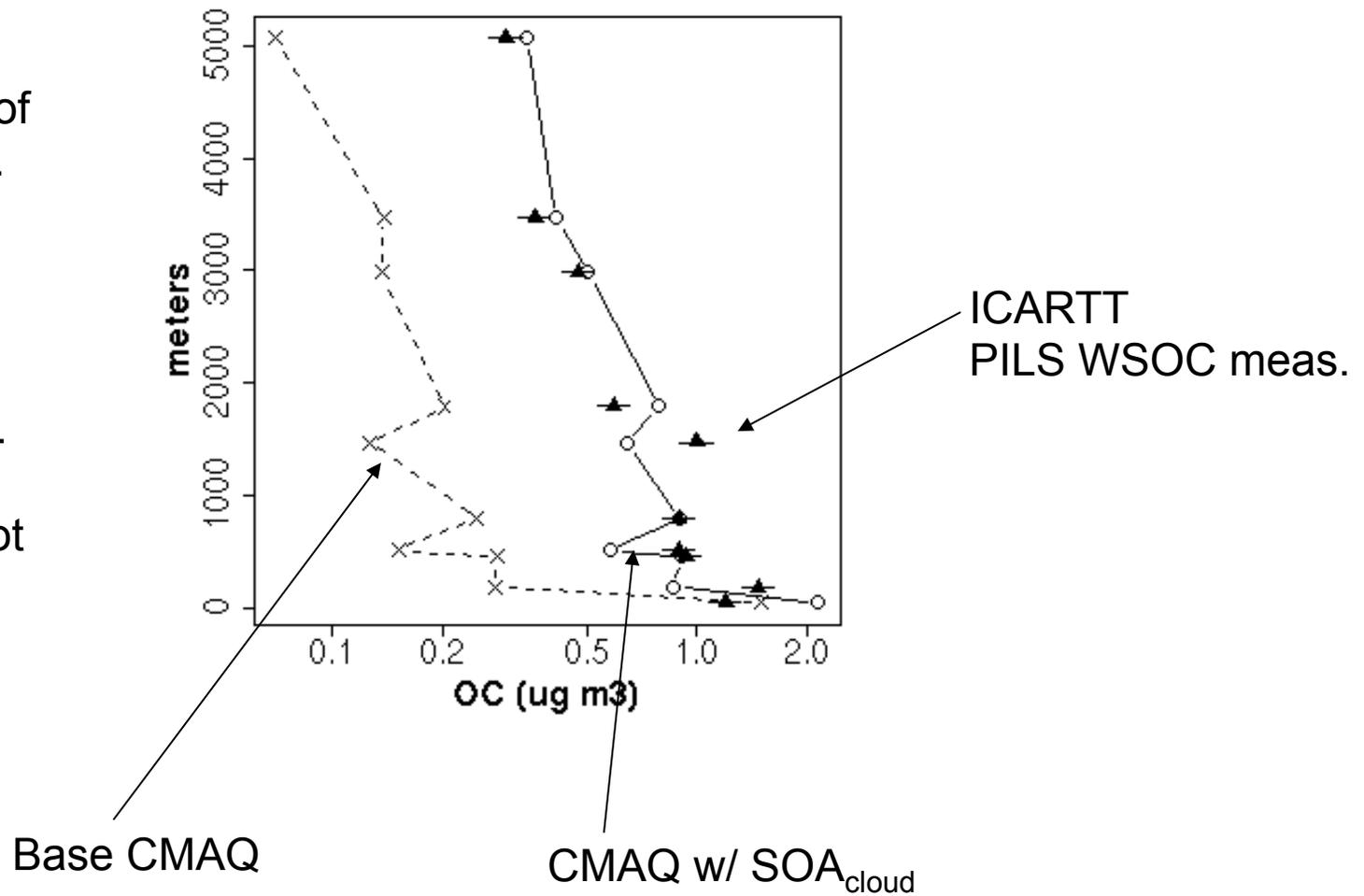
# ICARTT cloud experiment: Vertical Profile of particulate carbon

1<sup>st</sup> order approximation of aqueous phase organic chemistry improves model performance aloft.

Clouds are areas of convective mixing.

Organic chemistry improves the vertical profile of particulate carbon.

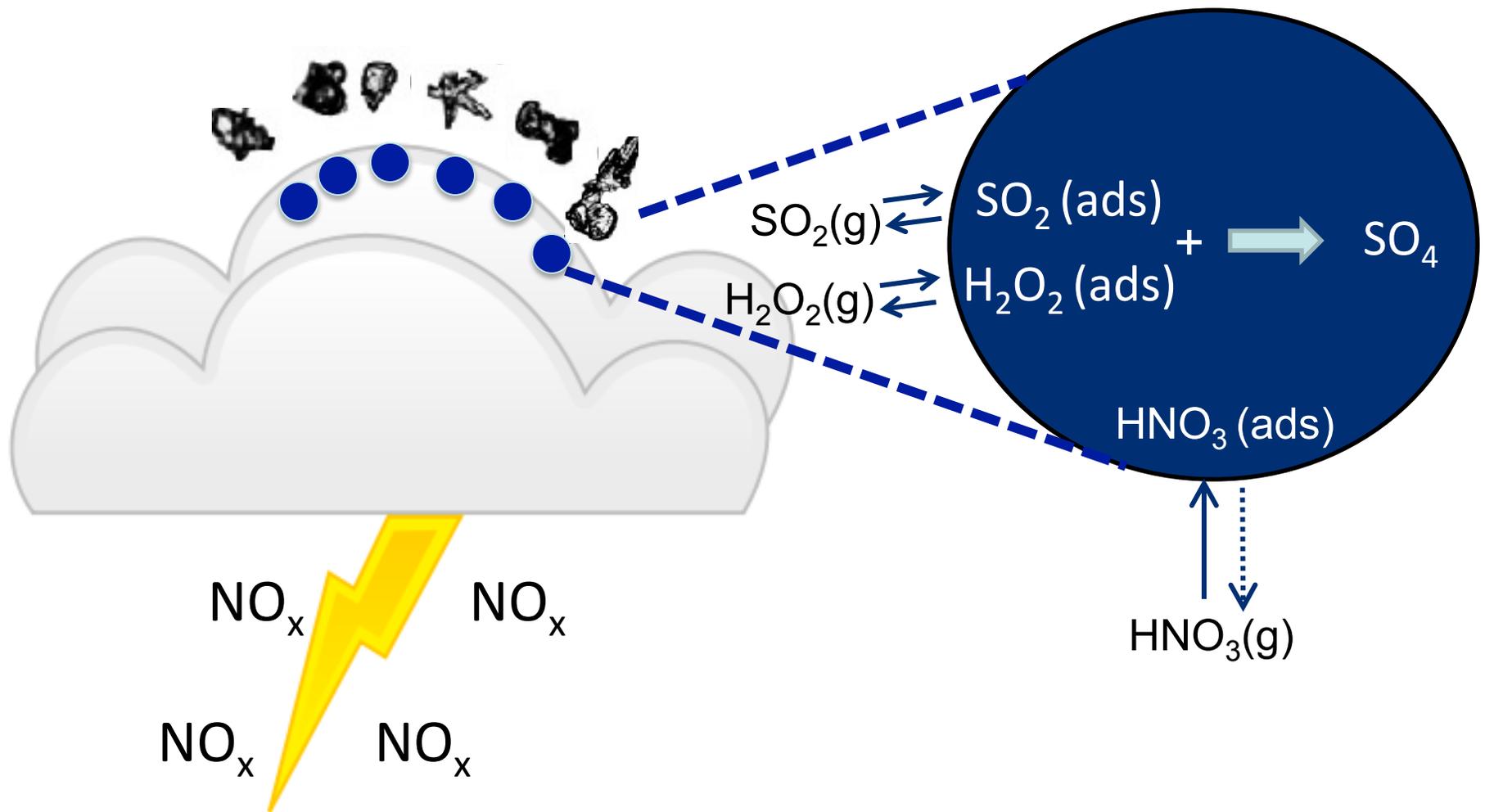
Other efforts do not change the aloft predictions (only surface mass)



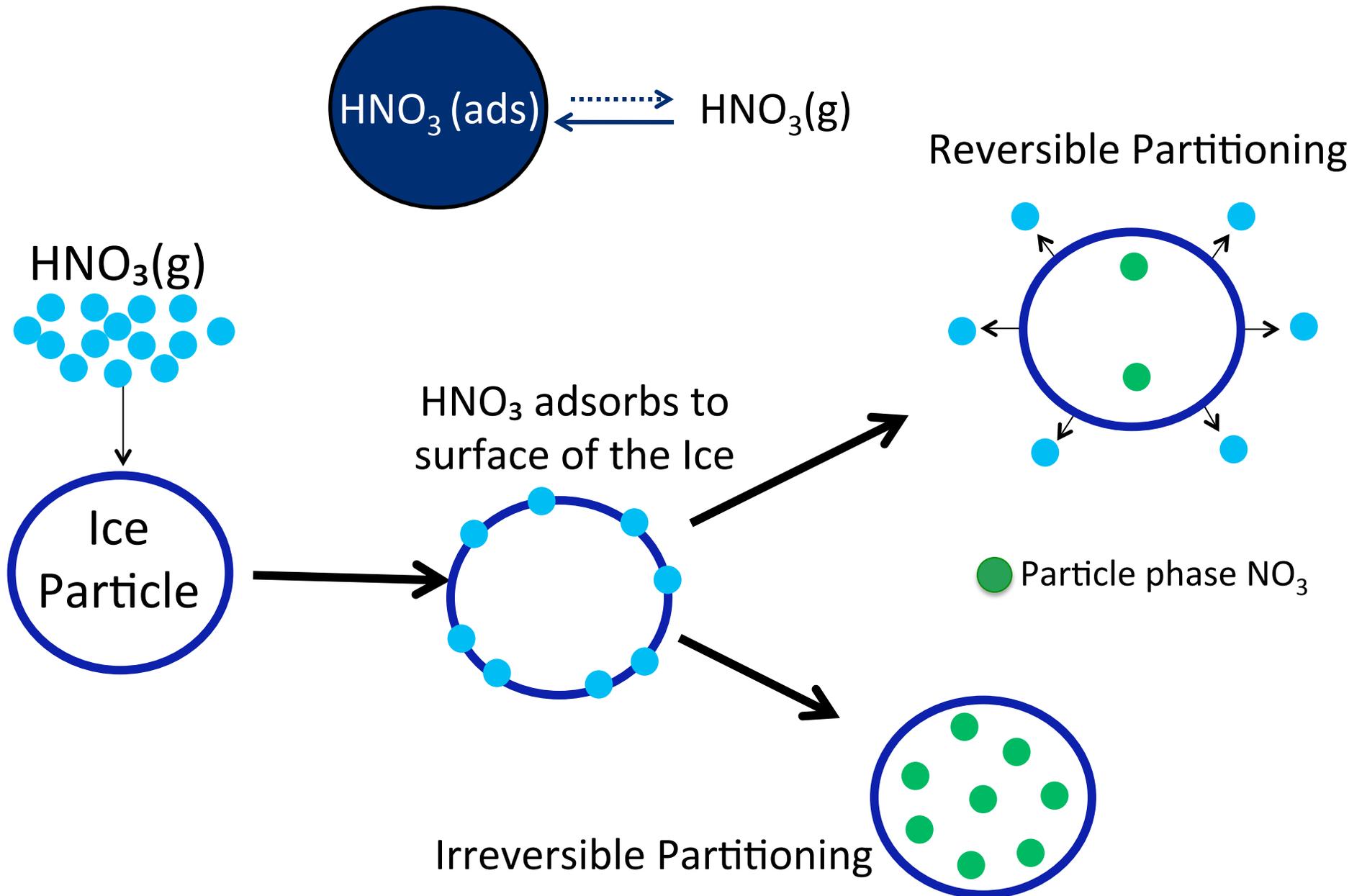
## What we proposed

- 1.) Develop **condensed phase mechanisms** suitable for CTMs that produce optically active **aerosol aloft**
- 2.) Identify conditions, precursors and sources that have the **largest impact** on brown carbon predictions
- 3.) Incorporate new mechanism(s) into WRF-CMAQ and evaluate impacts.

**ICE chemistry** 1) partitioning to cloud ice by  $\text{SO}_2$ ,  $\text{H}_2\text{O}_2$ ,  $\text{HNO}_3$ ; 2) ice phase  $\text{SO}_2 \rightarrow \text{SO}_4$  chemistry; 3) explore the sensitivity in aloft nitrate mass concentrations regarding debate over reversibility of  $\text{HNO}_3$  partitioning

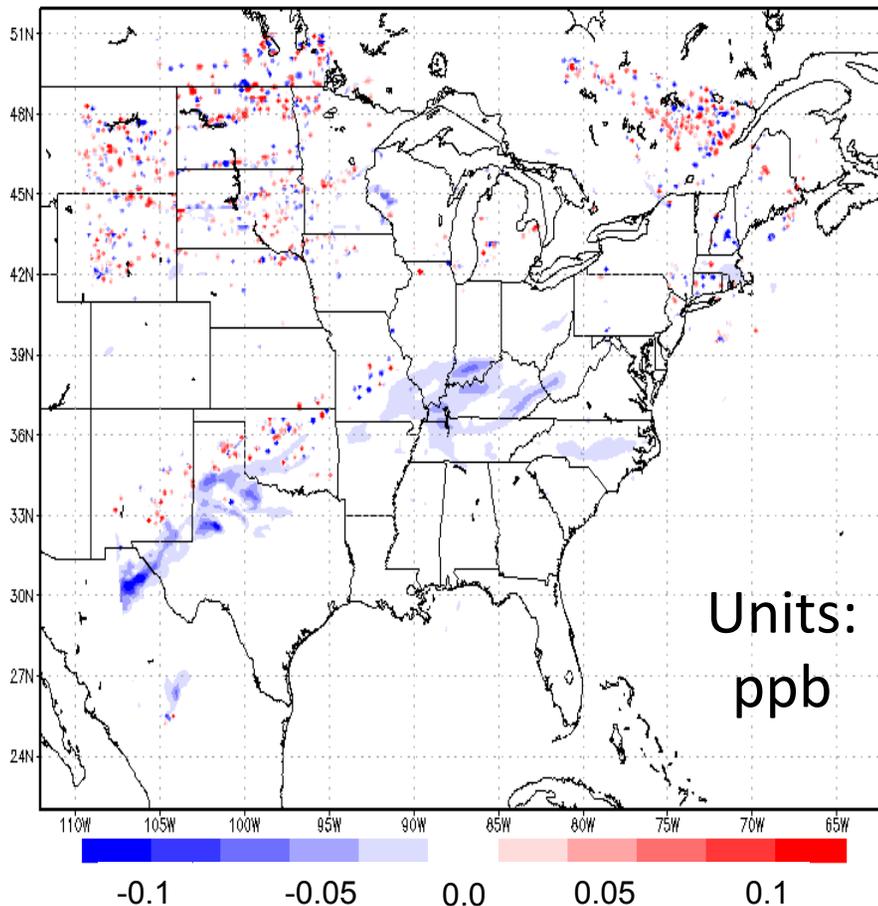


HNO<sub>3</sub> adsorption to ice and explore sensitivity to debate in the literature regarding reversibility

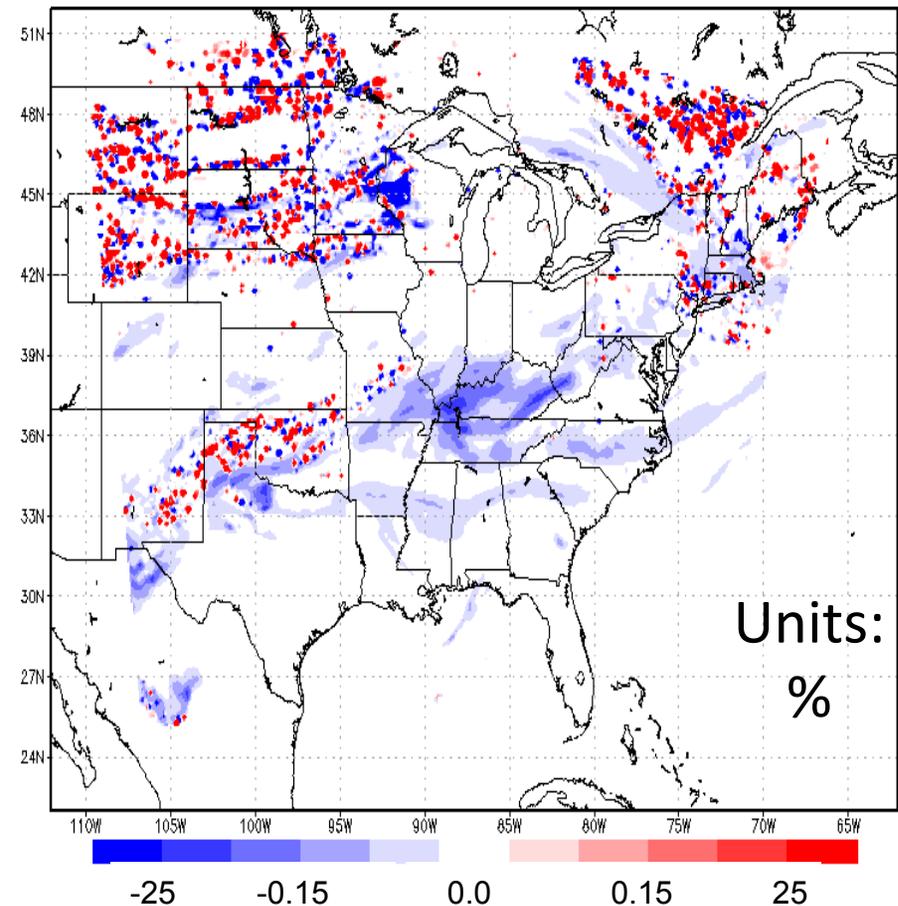


# [HNO<sub>3</sub>(g)] differences between base case and reversible partitioning

## Absolute Differences



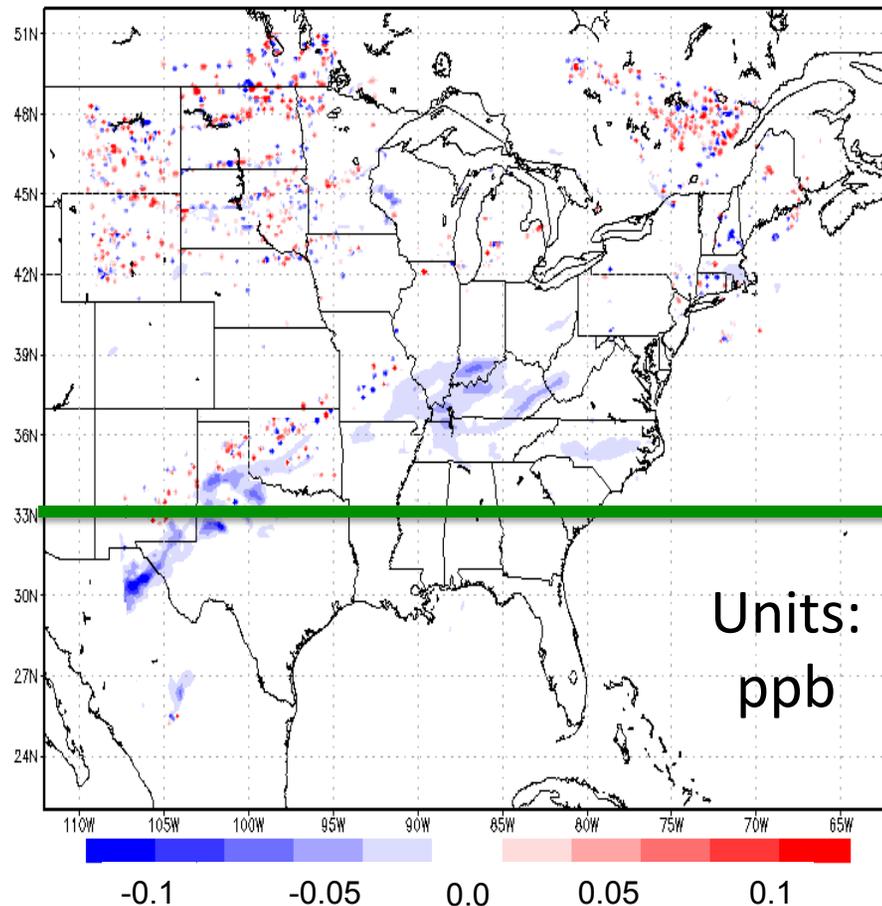
## Percent Differences



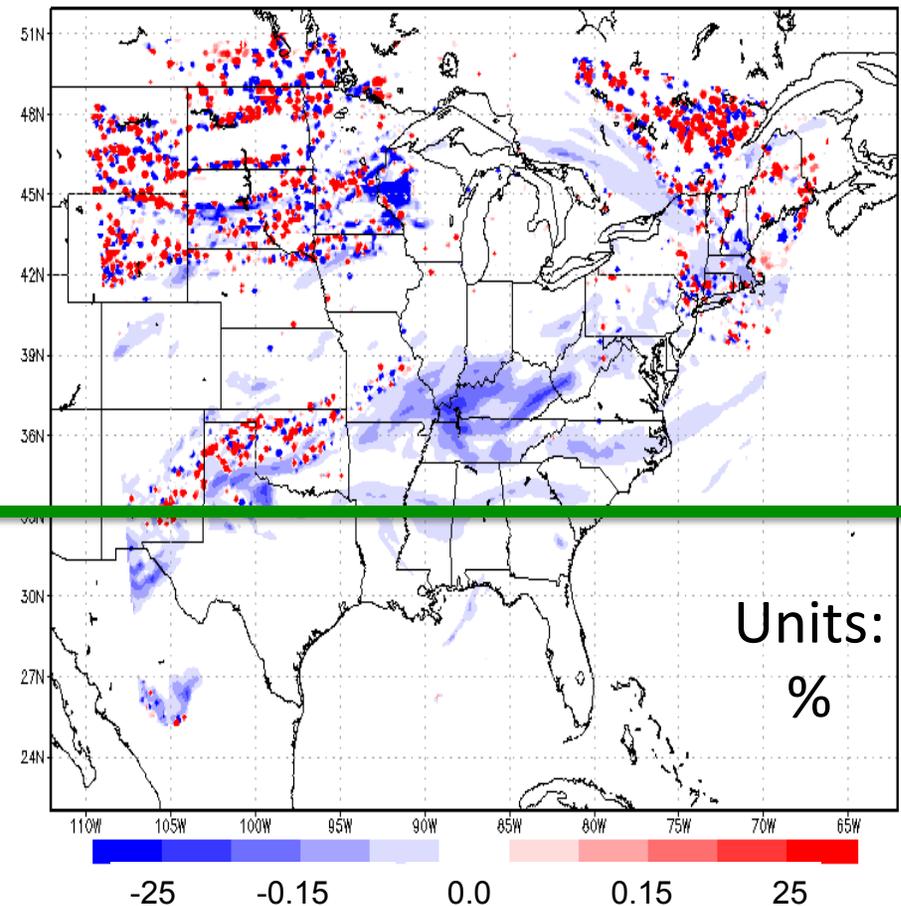
Changes in HNO<sub>3</sub>(g) were less in magnitude and smaller in spatial extent compared to 100% partitioning case. Plots at 400 mb for 0Z on August 12<sup>th</sup>.

# [HNO<sub>3</sub>(g)] differences between base case and reversible partitioning

## Absolute Differences

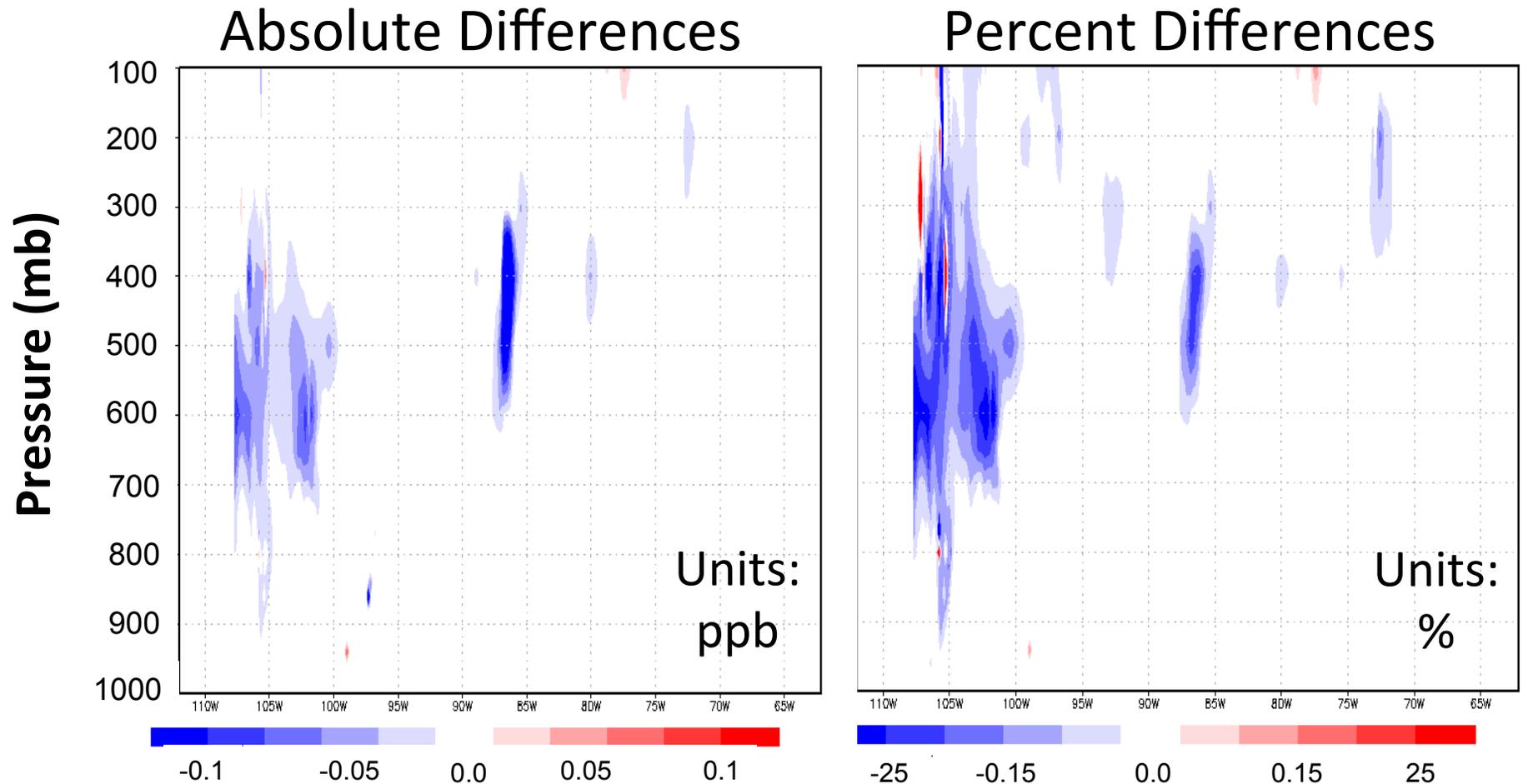


## Percent Differences



Changes in HNO<sub>3</sub>(g) were less in magnitude and smaller in spatial extent compared to 100% partitioning case. Plots at 400 mb for 0Z on August 12<sup>th</sup>.

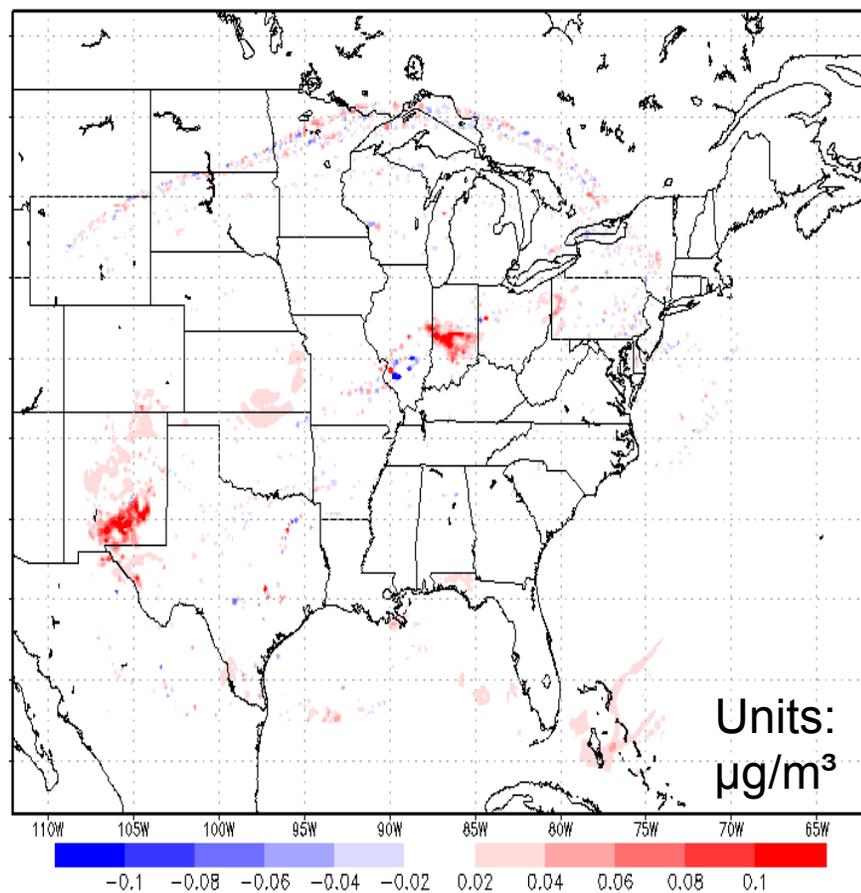
# [HNO<sub>3</sub>(g)] differences between base case and 100% partitioning



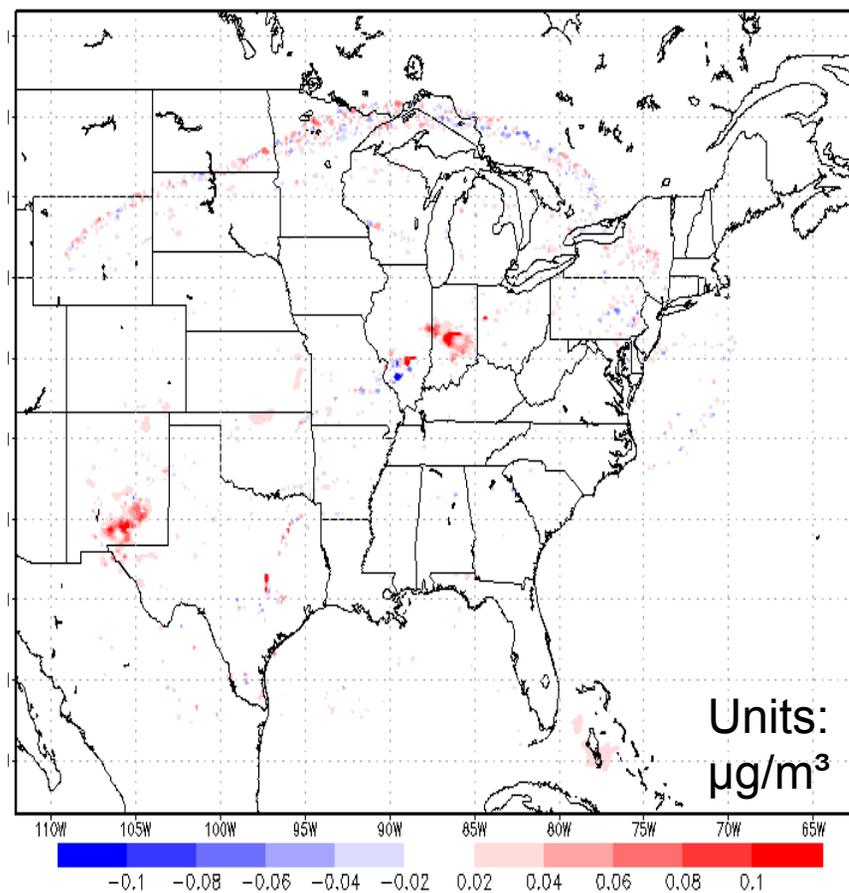
Large changes in [HNO<sub>3</sub>(g)] were seen from 300 mb to 650 mb for latitude of 33°N at 10Z on August 23rd

Difference in **accumulation mode** [NO<sub>3</sub>] when ice chemistry is included at **100 mb** for 0Z on August 12<sup>th</sup>. Maximum differences > 0.10 μg m<sup>-3</sup>

Irreversible Partitioning Case

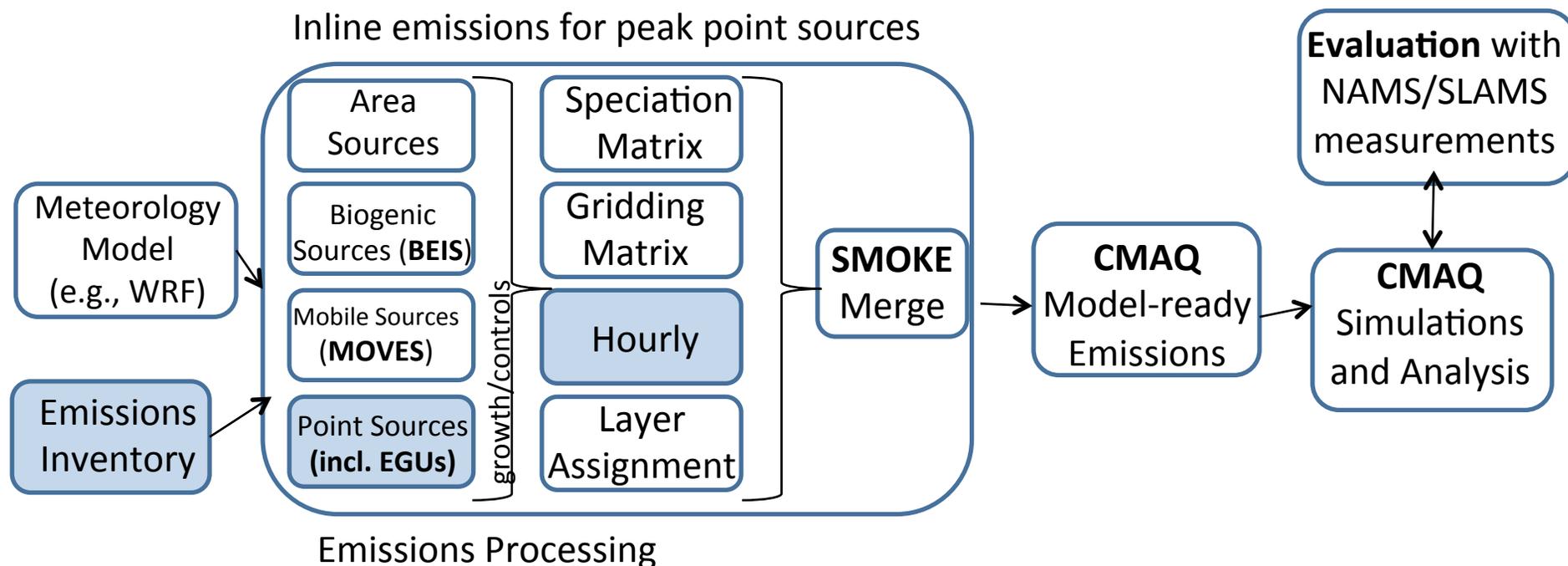


Reversible Partitioning Case



Marmo et al., *AE*, (2013): The modified CMAQ subroutines are available for sharing!

**Assessing primary EC/OC emission sources:** mobile, residential, meat cooking and electricity largest sources in NJ

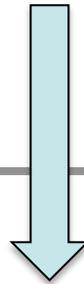


**Hourly temporal assignment** based on *a priori* calculations to describe typical conditions designed and reflect annual average/total.

## Custom PM Emission Factor Calculation

NEI Annual  
PM  
emissions  
(tons)

=

Tons per  
mmBTU of  
PMNO<sub>x</sub> CEM  
Annual  
Heat Inputs  
(mmBTU)CEM  
Hourly Heat  
Inputs  
(mmBTU)

×

Custom PM  
Emission  
Factor  
(tons/mmBTU)

=

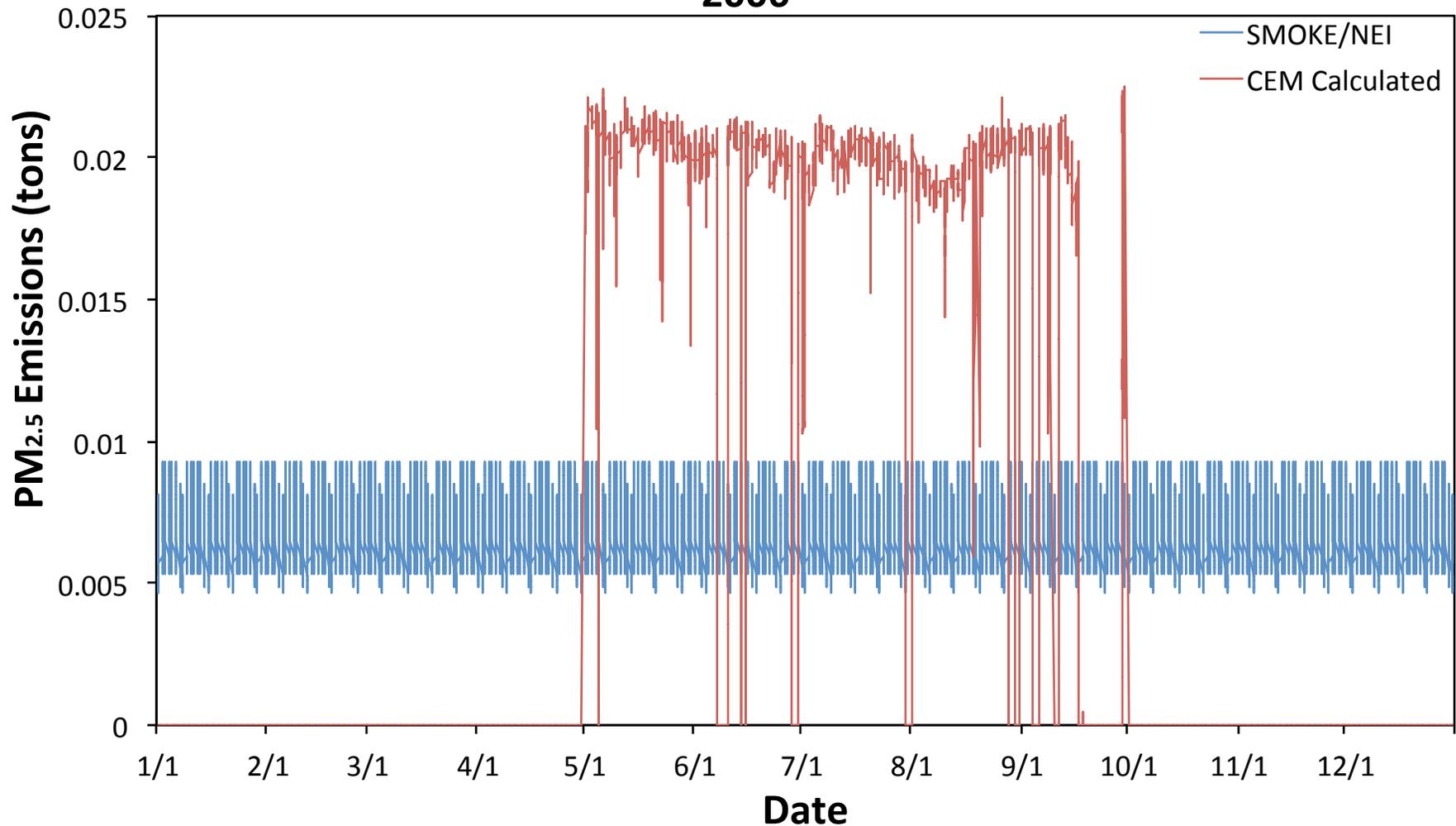
Hourly  
PM Emissions  
(tons)

Actual measured emission data is not used for point sources with CEMs when “ORIS” ID number is not reported with annual NEI total.

# SMOKE vs. Carlton Group - PM<sub>2.5</sub> Emissions

AES Beaver Plant - Pennsylvania Coal Plant

2006



Intermediate Load Facility

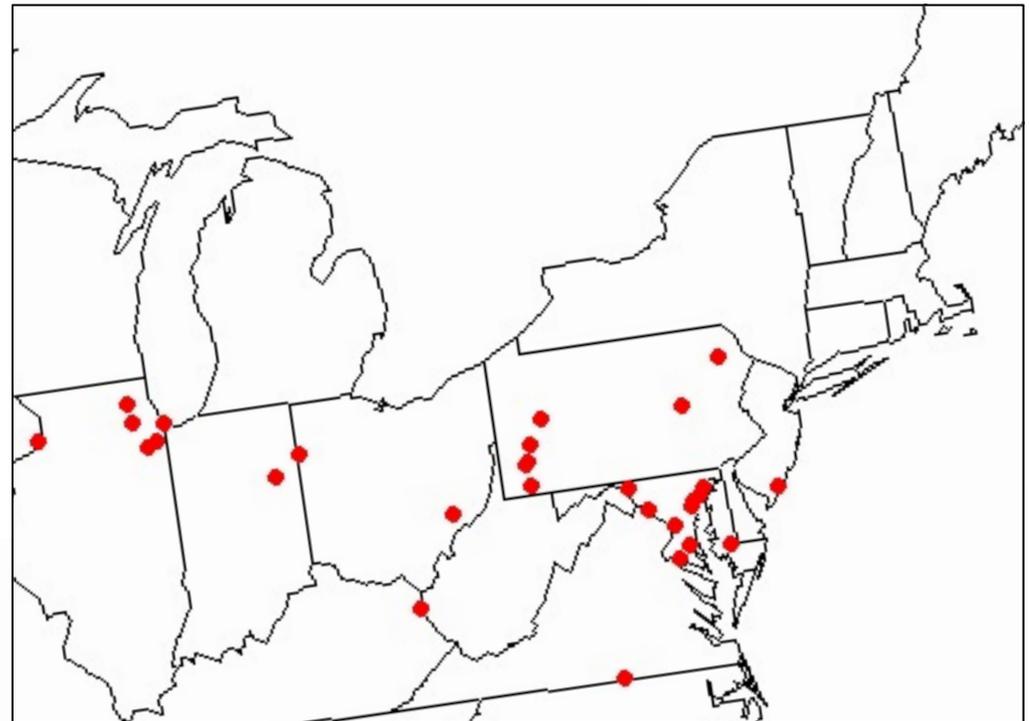
Modeled EGU plants in PJM energy sector July 12 –25, 2006:  
Major heat wave over entire continental US. Record temperatures (high and low)

**1450** units in PJM  
(including renewables and nuclear)

**910** units have CEMS

**390** units EIA/ORIS matches  
between the NEI and CEM

**138** modeled (Primary SCCs)

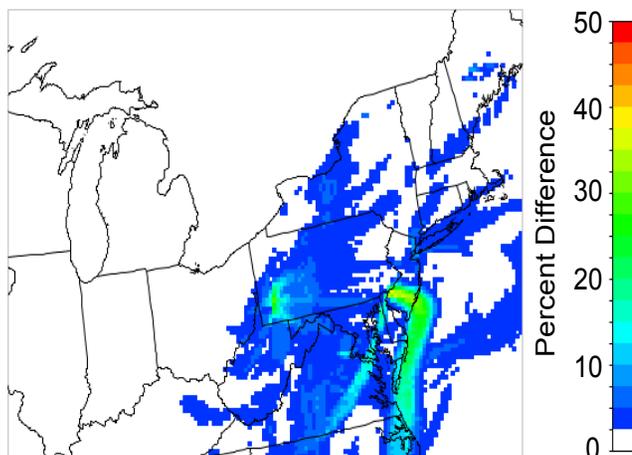


“crosswalk” used to match  
facilities is available upon  
request!

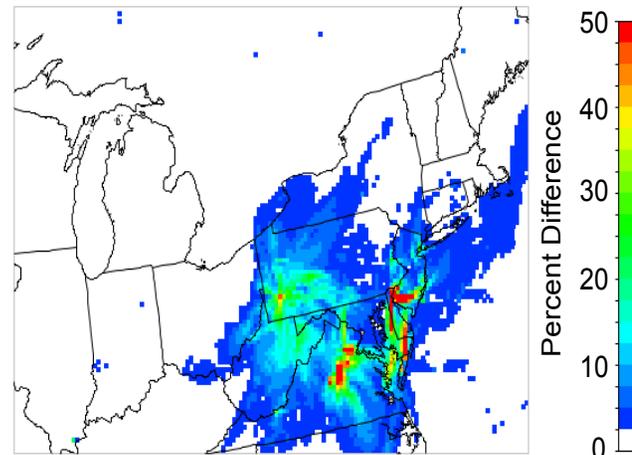
- CMAQv4.7
- CB05-TU
- BEISv3.14
- WRFv3
- 12km x 12km
- 34 layers to 50mb
- 2005 NEIv4.2
- SMOKEv3.5

# [EC] differences at the surface and aloft (800mb)

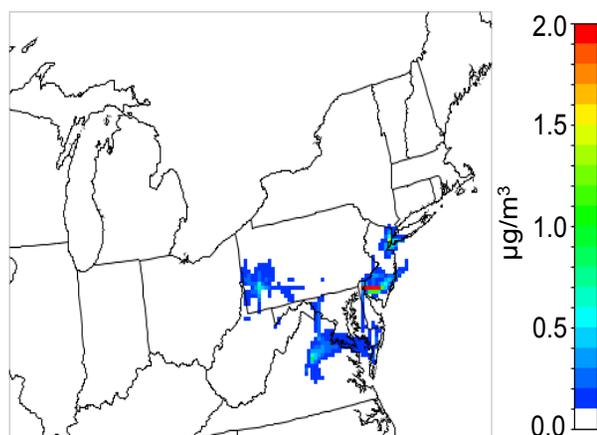
Surface [EC] (%)



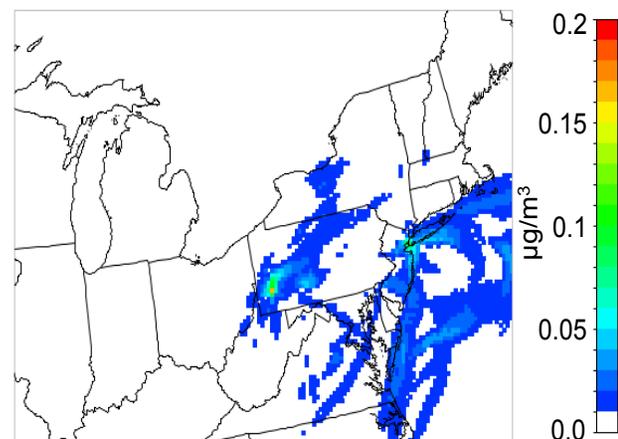
Aloft 800 mb [EC] (%)



Surface [EC] ( $\mu\text{g m}^{-3}$ )



Aloft 800 mb [EC] ( $\mu\text{g m}^{-3}$ )



## **Developing and implementing more robust representation of organic aqueous chemistry**

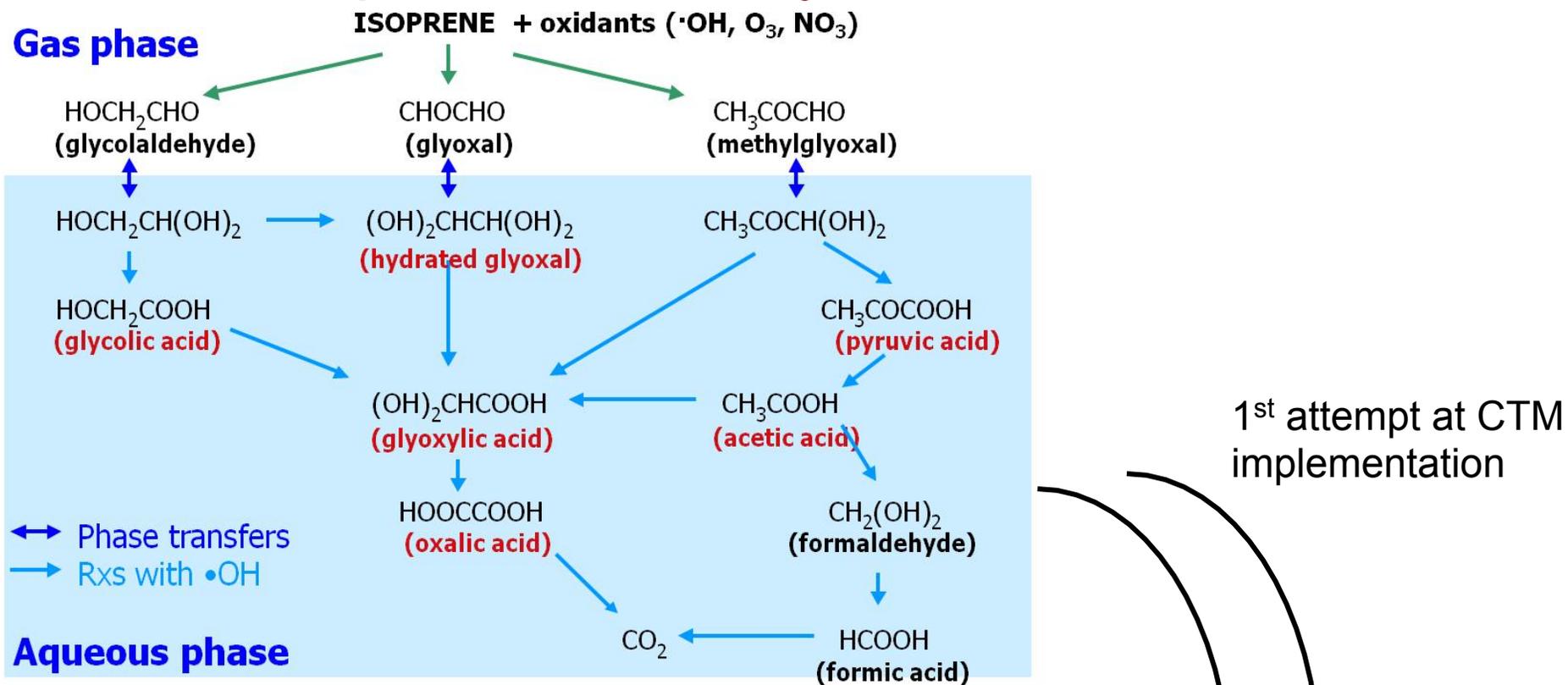
Identify the most important water-soluble gas phase precursors and controlling factors for cloud-produced OA.

Develop expanded and efficient new chemical mechanism

Develop new solver technique – collaboration with Kathleen Fahey and Bill Hutzell

# Early Implementation of aqueous organic chemistry

## Lab experiments verify



Carlton *GRL* 2006, *AE* 2007; Altieri *EST* 2006, *AE* 2008; Perri *AE* 2009

1<sup>st</sup> attempt at CTM implementation

glyoxal + OH → "cloud SOA"

methylglyoxal + OH → "cloud SOA"

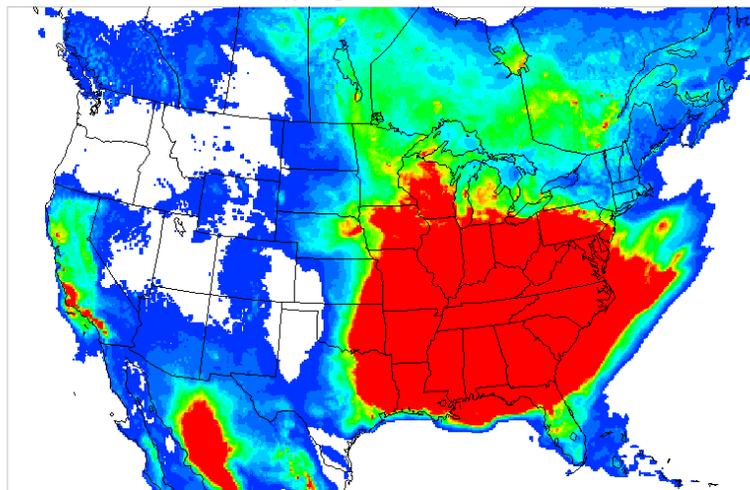
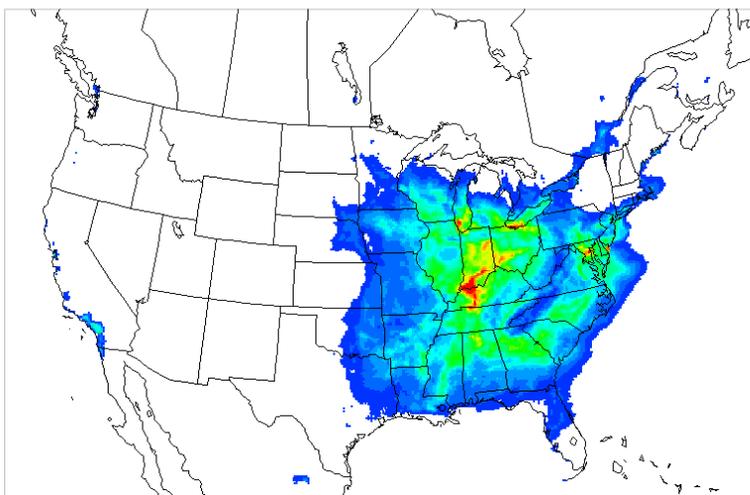
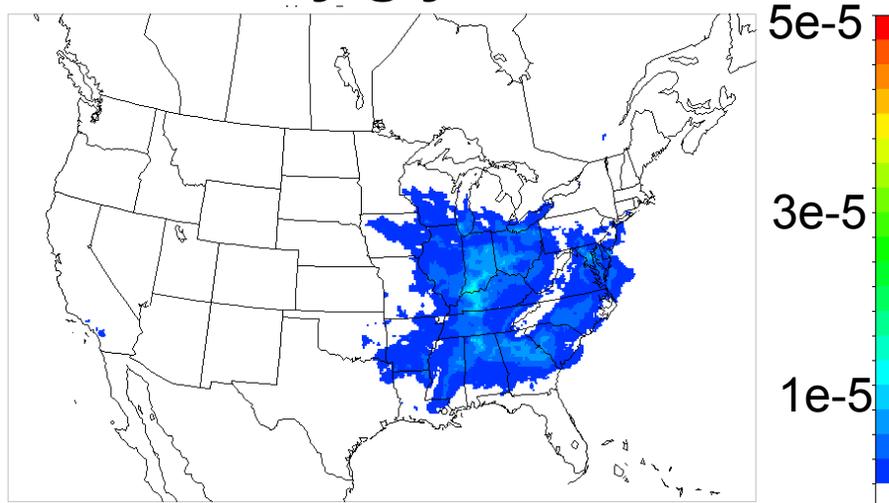
Abundance	WSOM potential
MEK	Glyoxal
Acetaldehyde	Methylglyoxal
Acetic acid	Acetic acid
Formaldehyde	Formaldehyde
Methanol	Acetaldehyde
Acetone	Acetone
Methylglyoxal	MEK
Glyoxal	Methanol
MVK	MVK
Methacrolein	Methacrolein

▶ 
$$C_J(aq) = H_J RTLC_J(g)$$

**IEPOX**

$$C_J(aq) = H_J RTLC_J(g)$$

**IEPOX** is predicted to be dominant SOA component, consistent with very recent measurements  
Karambelas et al., *ES&T Letters*, 2014.

**Glyoxal****Methylglyoxal**

## Modeling 10 days of the SOAS campaign (12km x 12km CONUS) AERONET measurements at SOAS site

1.) Base case, CMAQv5.01

1a.) added heterogeneous IEPOX chemistry (Pye et al., *ES&T*, 2013)

**1b.)** expanding aqueous chemical mechanism to include ammonium-organic reactions

**1c.)** Liquid water uncertainty analysis (Liu, Horowitz, Carlton et al., *ACP*, 2013)

**2.)** KPP (RODAS3 solver) for same aq. chemical mechanism in base model with CB05 gas phase chemical mechanism collaboration with EPA: K. Fahey, B. Hutzell

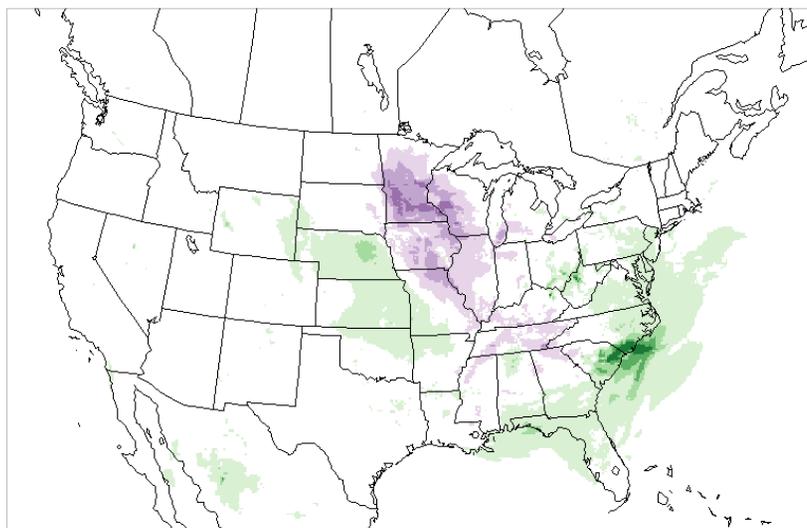
Droplet dependent kinetic partitioning, droplet size is consistent with WRF predictions/meteorology assumptions.

2a.) SAPRC07 gas phase chemical mechanism

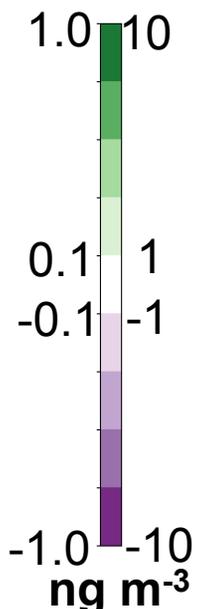
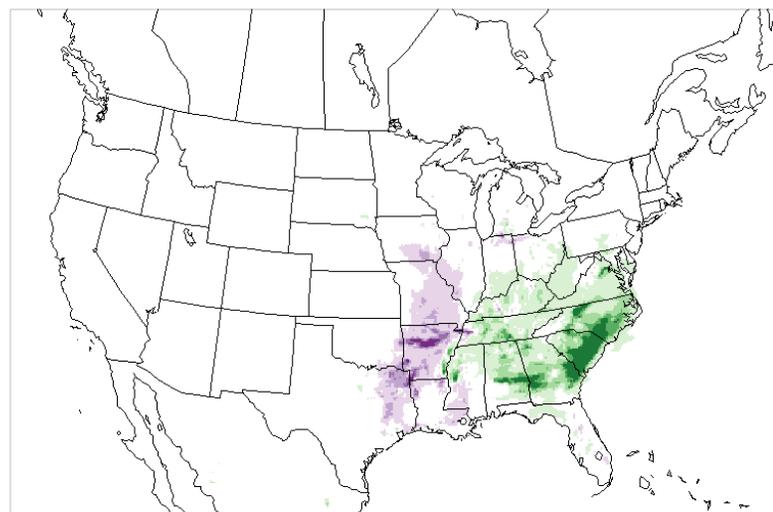
2b.) More explicit aq. chemical mechanism with SAPRC07

including glycoaldehyde as a precursor, explicit carboxylic acids

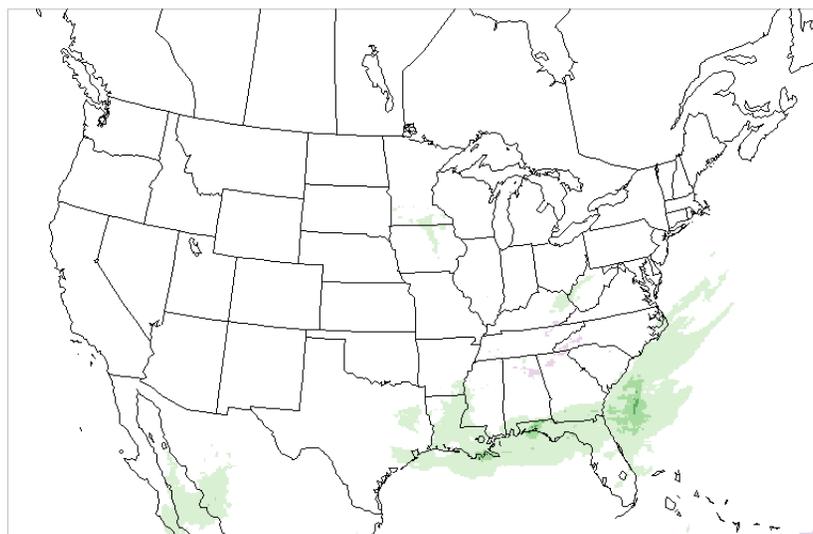
**Surface aqSOA**



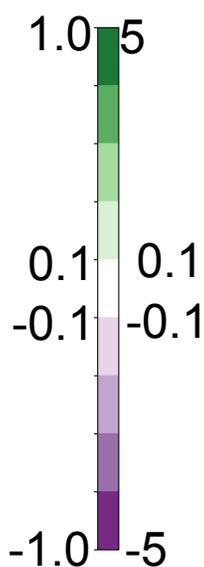
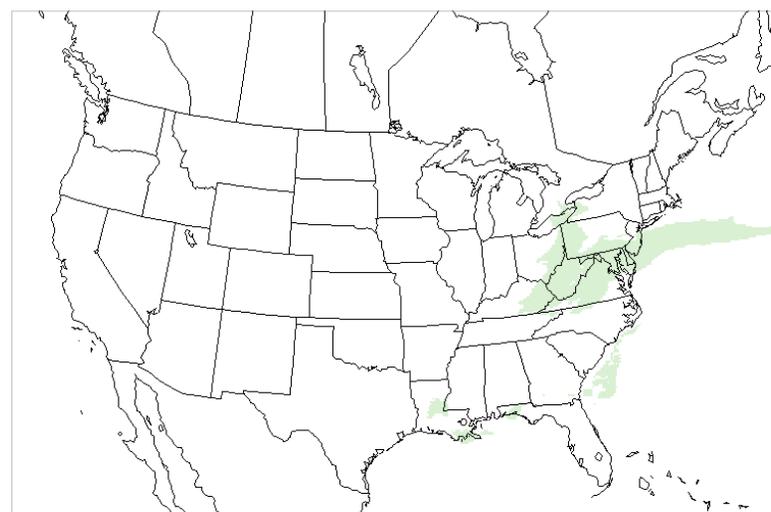
**Surface Total SOA**



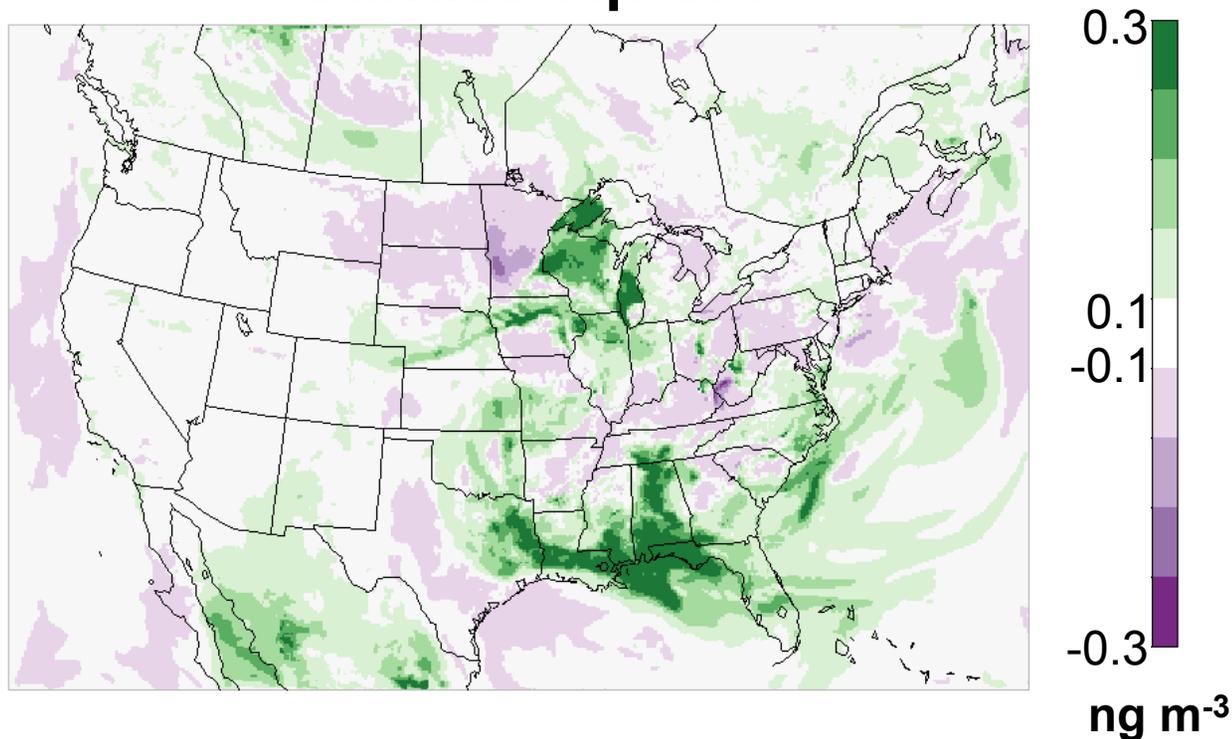
**Aloft (800mb) aqSOA**



**Aloft (800mb) Tot SOA**



## Surface aqSOA



He, Liu, Horowitz, Carlton et al., *ACP*, (2013) found that in a global model that for a given organic cloud chemical mechanism, liquid water content was the most sensitive parameter

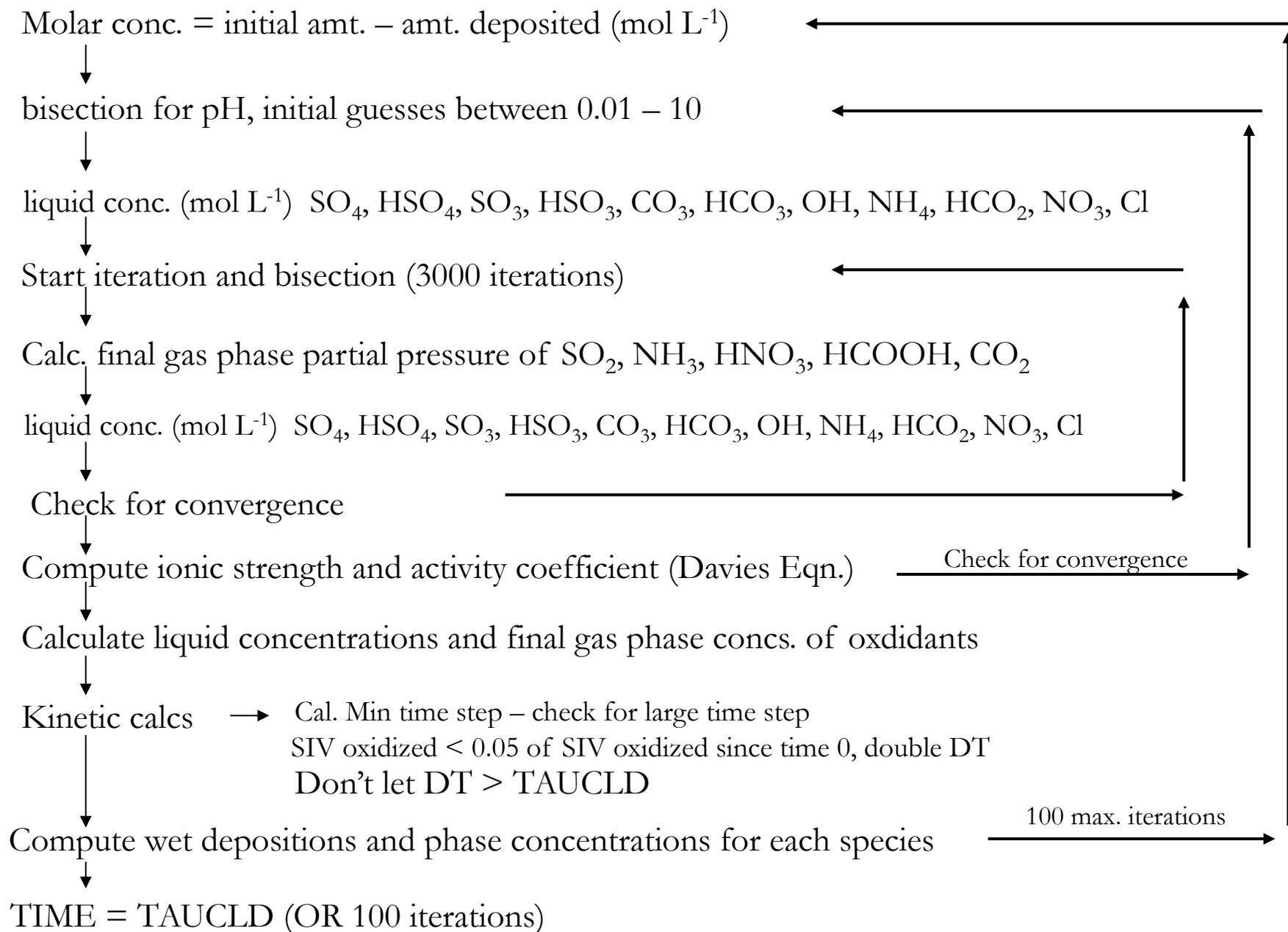
Atmospheric aqueous phase chemistry is more complex than typical model mechanisms

Current CMAQ aqueous chemistry module does not easily expand

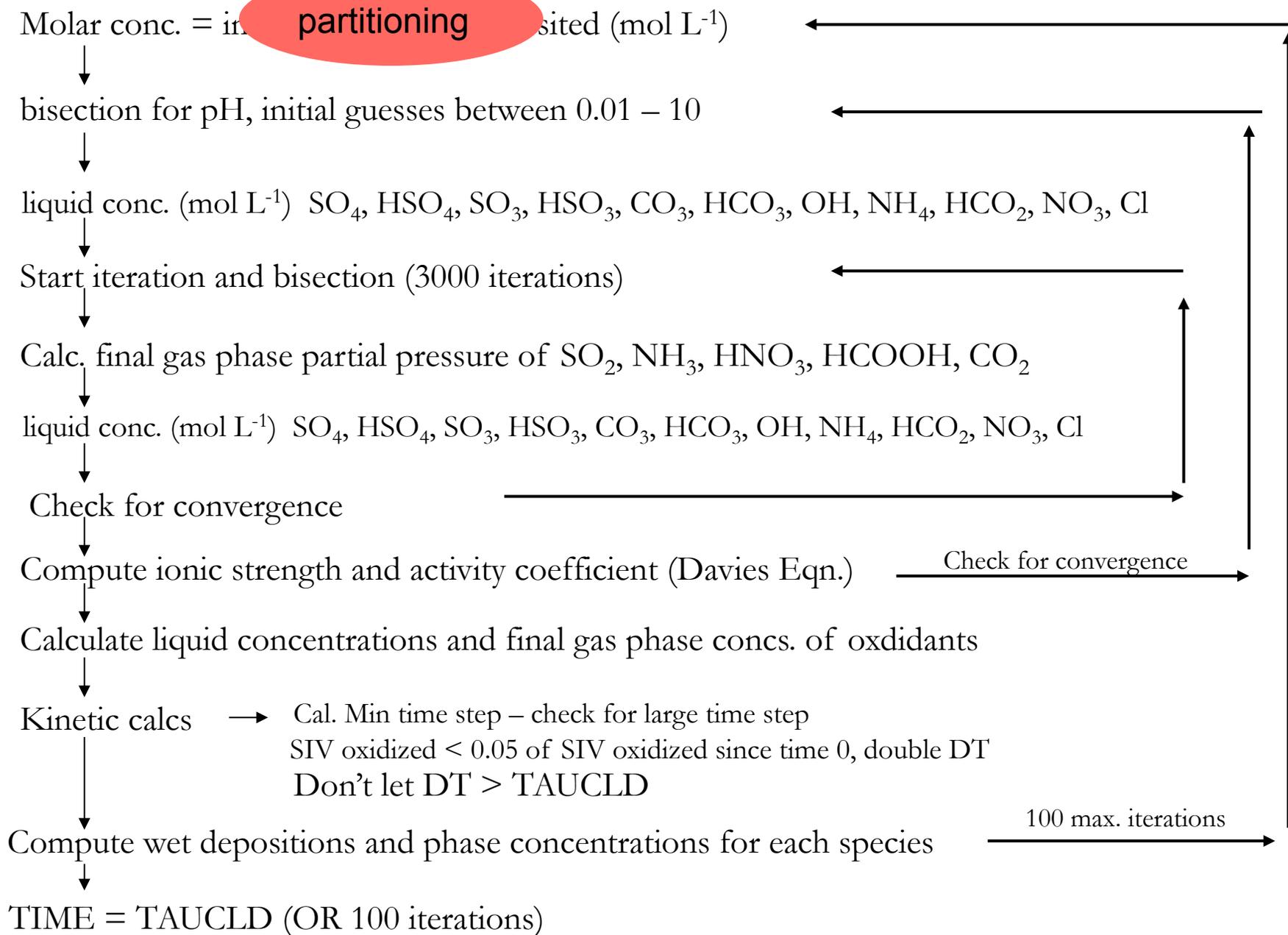
- Forward Euler solver for oxidation and bisection method for pH (note: linear convergence for bisection method)
- Stiffness induced by wide dynamic range of the system

RODAS3 solver in KPP is a good candidate for solving atmospheric aqueous chemistry (Sandu et al., 1997; Djouad et al., 2002)

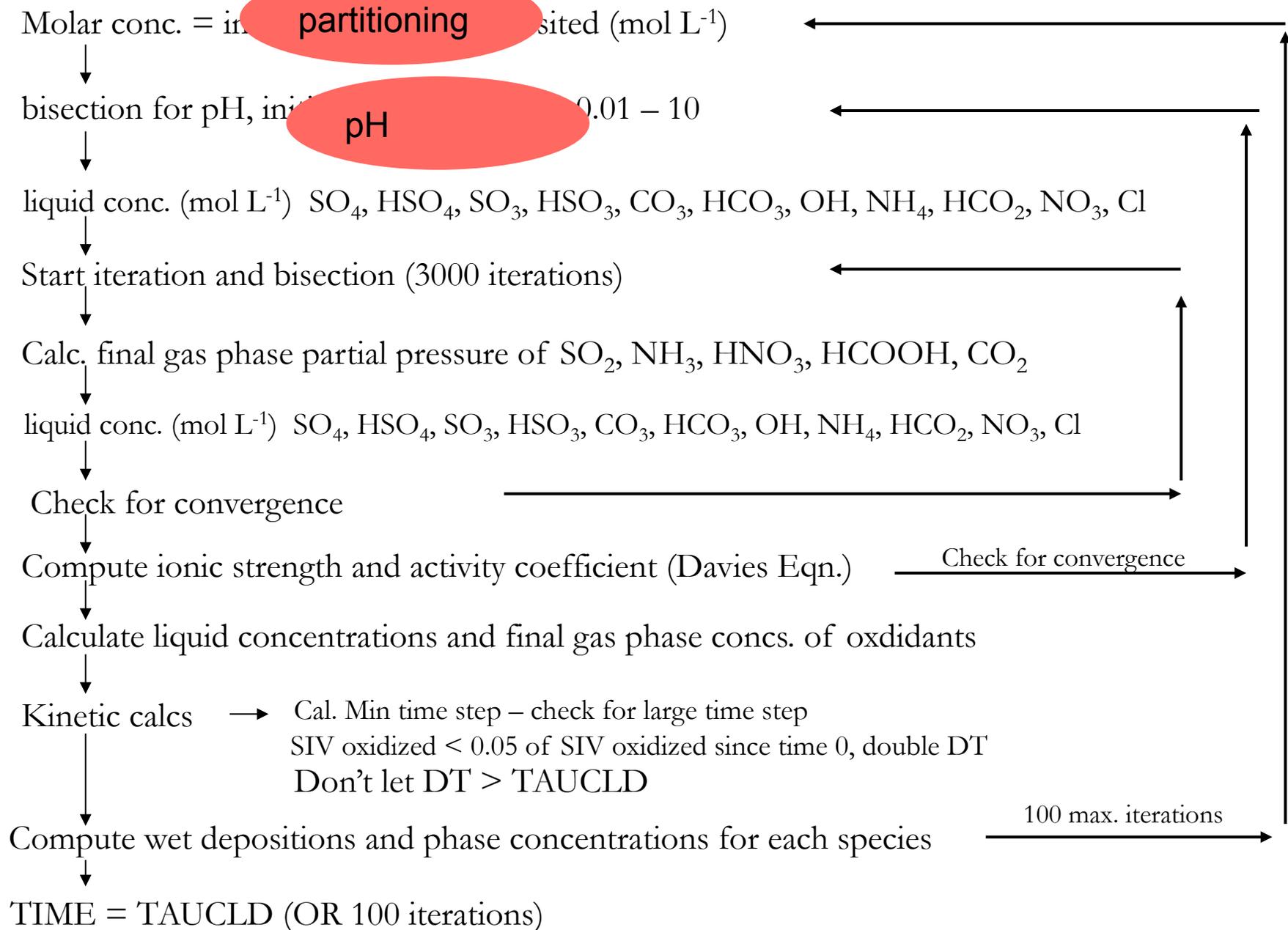
# CMAQ Aqueous Chemistry Map (*aqchem.F*)



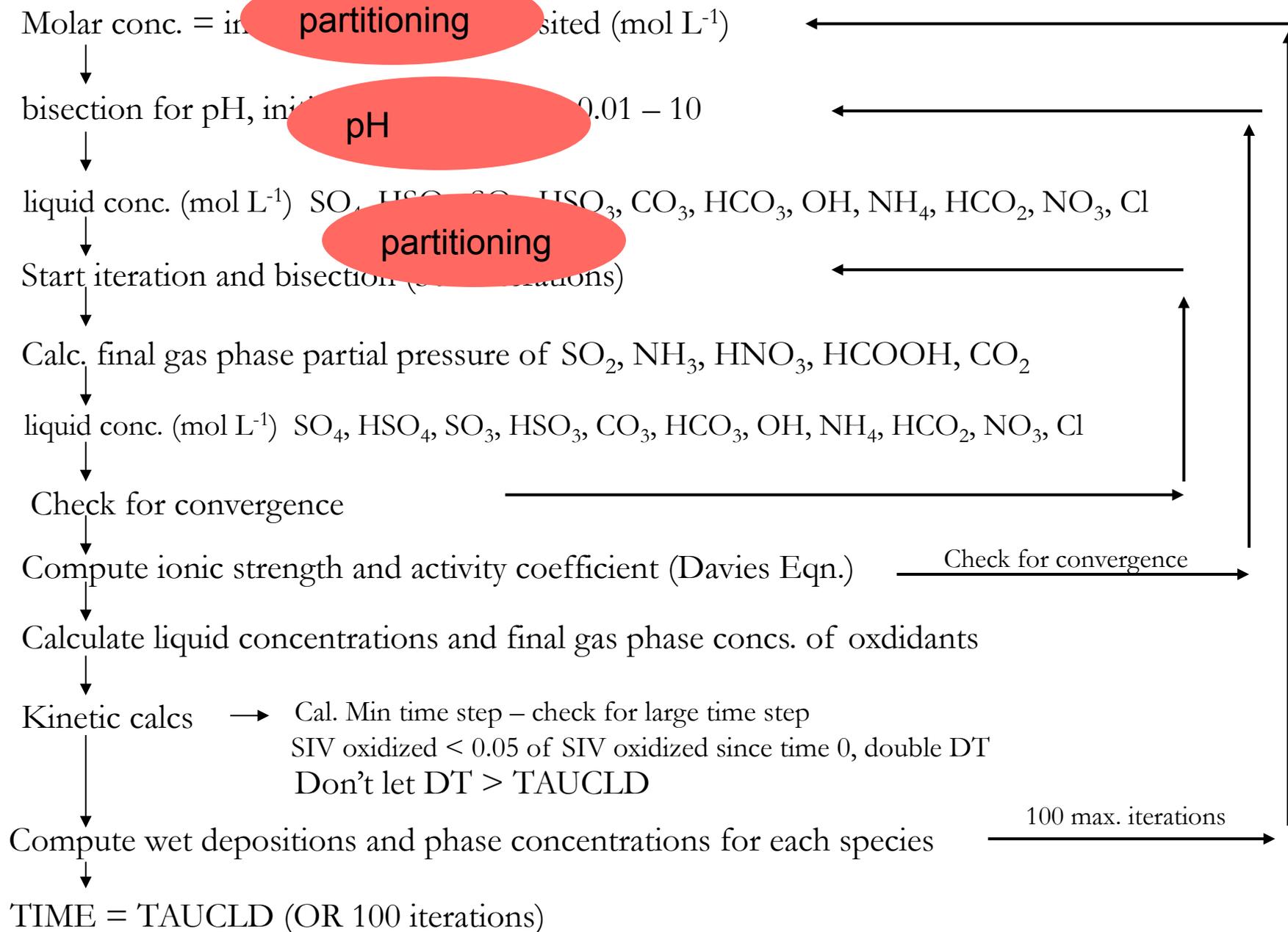
# CMAQ Aqueous Chemistry Map (*aqchem.F*)



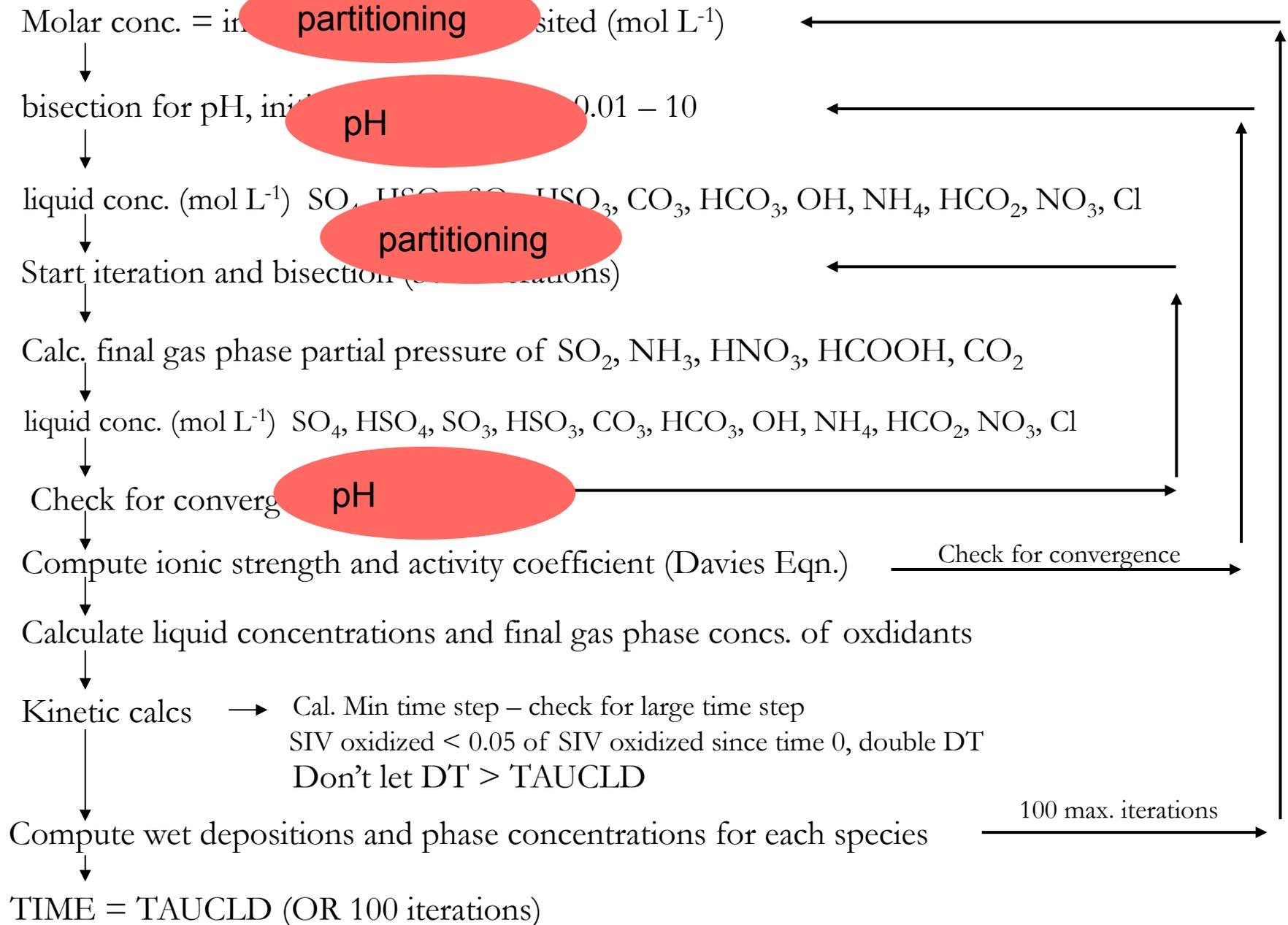
# CMAQ Aqueous Chemistry Map (*aqchem.F*)



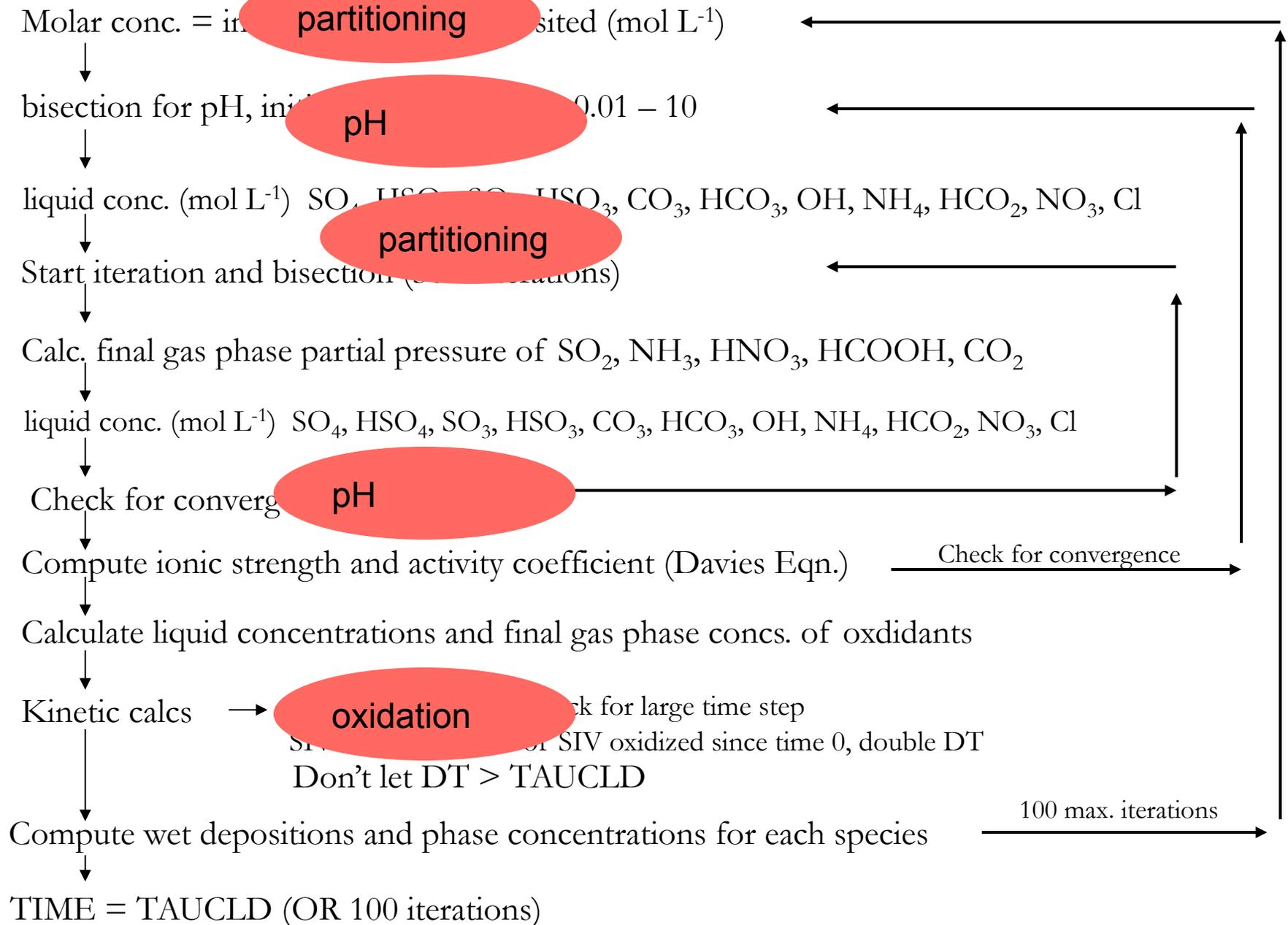
# CMAQ Aqueous Chemistry Map (*aqchem.F*)



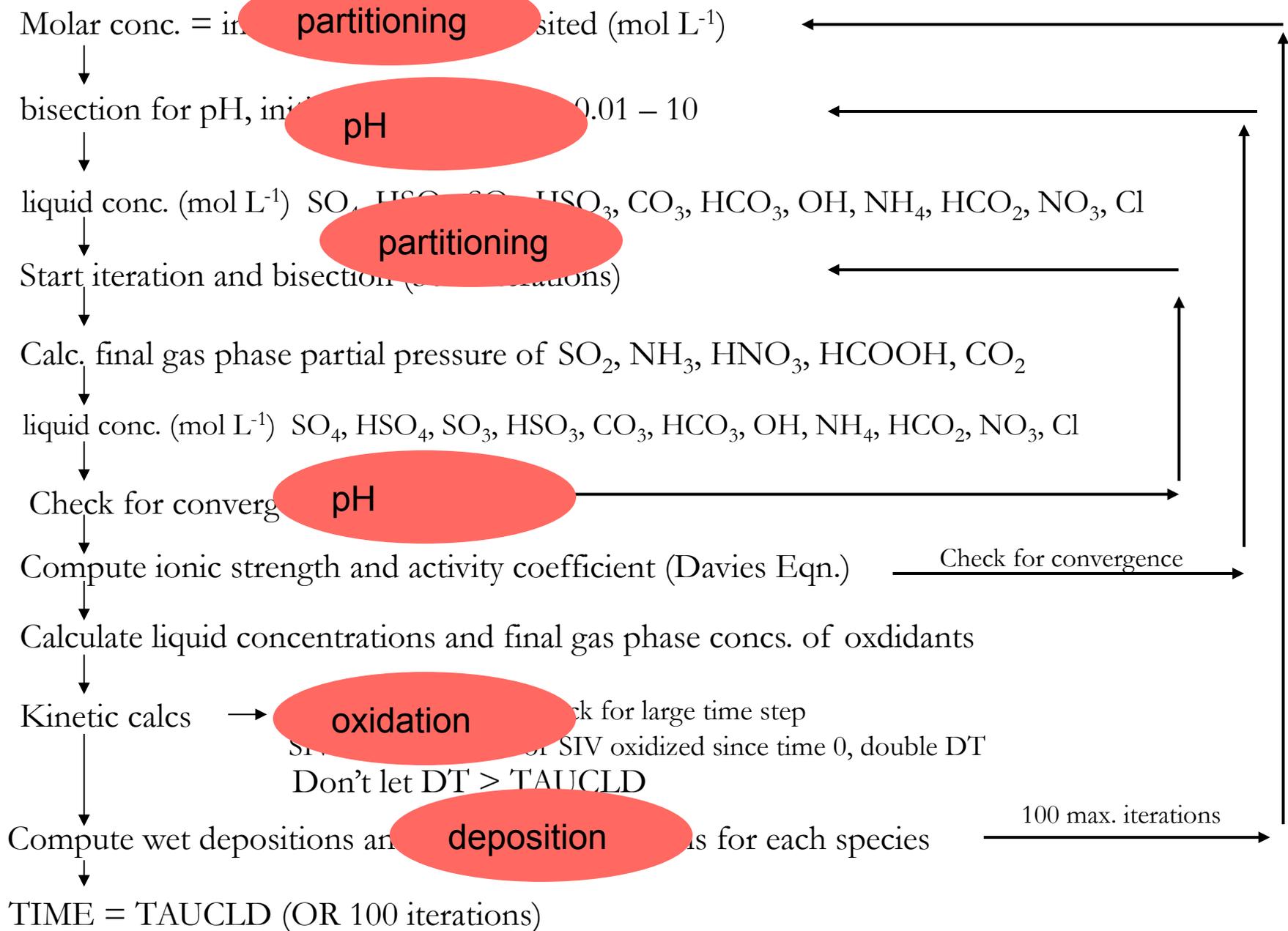
# CMAQ Aqueous Chemistry Map (*aqchem.F*)



# CMAQ Aqueous Chemistry Map (*aqchem.F*)



# CMAQ Aqueous Chemistry Map (*aqchem.F*)





$$A_i(aq) = H_A p_A \quad \text{Theoretical maximum}$$

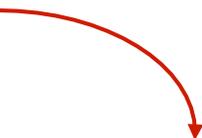
$$\frac{dA_i}{dt} = \underbrace{Q_{A_i}}_{\text{aqueous production}} - \underbrace{S_{A_i}}_{\text{sink reactions}} + \underbrace{Lk_{mt}G_i}_{\text{accommodation}} - \underbrace{\frac{k_{mt}A_i}{HRT}}_{\text{volatilization}}$$

$$k_{mt} = \left( \frac{R_d^2}{3D_g} + \frac{4R_d}{3\alpha v} \right)^{-1} \quad v = \left( \frac{8RT}{\pi MW} \right)^{1/2}$$

interfacial processes by Schwartz (1986)

Comparison of cloud-produced sulfate when  $\text{SO}_2$  partitions according to Henry's Law to "bulk" cloud water vs. kinetic mass transfer to monodisperse droplet population.

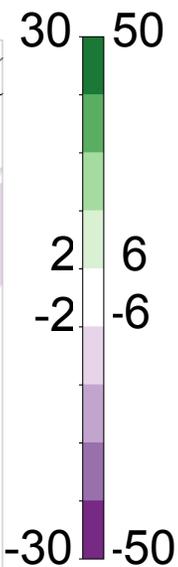
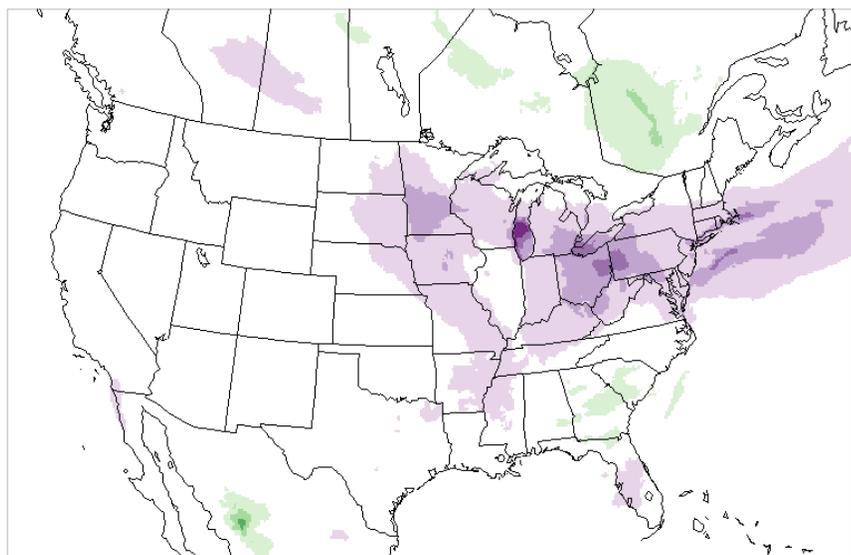
Current approach in CMAQ



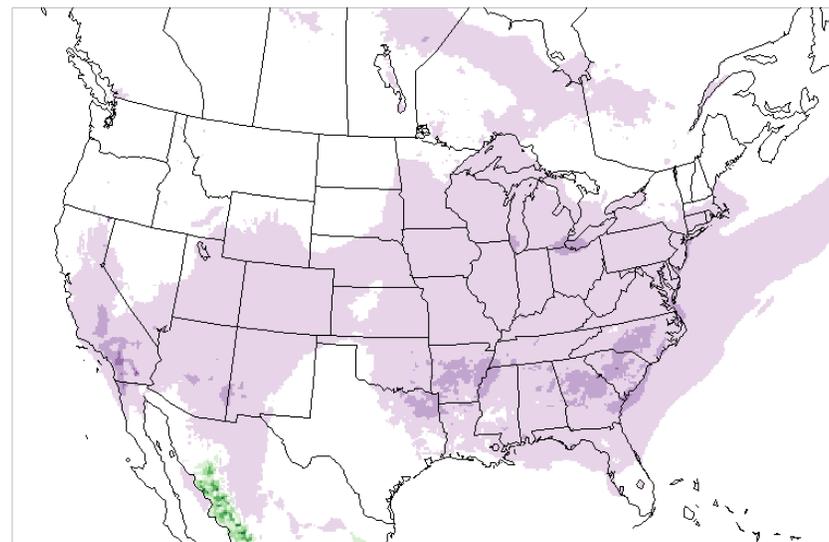
	Bulk chemistry (no droplets)	5 $\mu\text{m}$ droplets	10 $\mu\text{m}$ droplets	20 $\mu\text{m}$ droplets
Predicted sulfate ( $\mu\text{g m}^{-3}$ )	3.5	2.3	2.1	2.0

Note: surface level cloud-produced sulfate. Averaged values for the continental U.S.

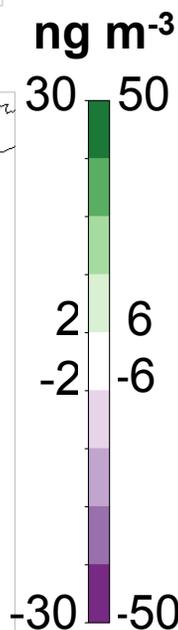
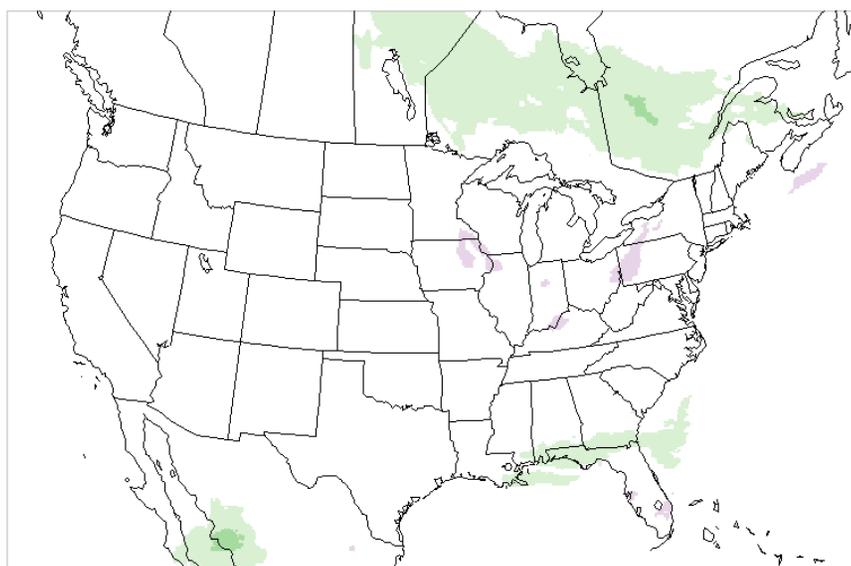
**Surface aqSOA**



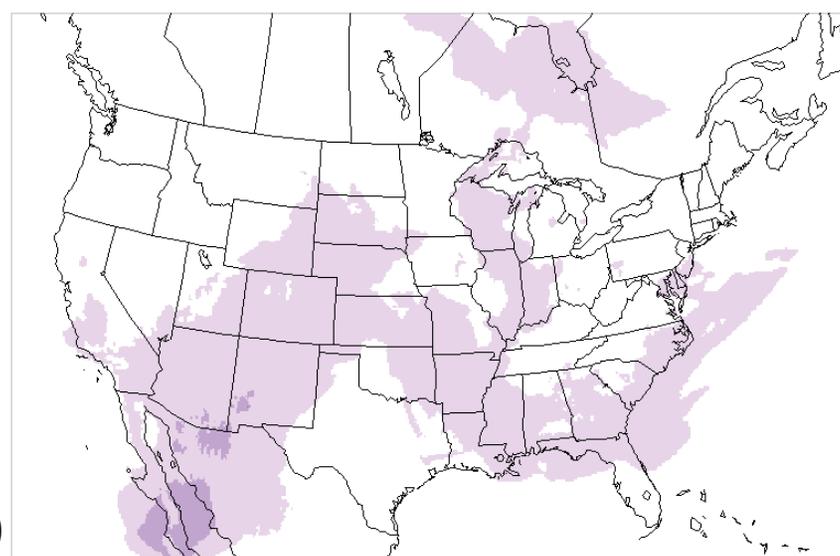
**Surface Total SOA**



**Aloft (800mb) aqSOA**



**Aloft (800mb) Tot SOA**



Continued refinement of EC/OC emissions from electricity sector

behind the meter, other peak demand generation

Continued refinement and validation of aqueous chemical mechanisms: SOAS data

in particular AERONET measurements

assign refractive properties

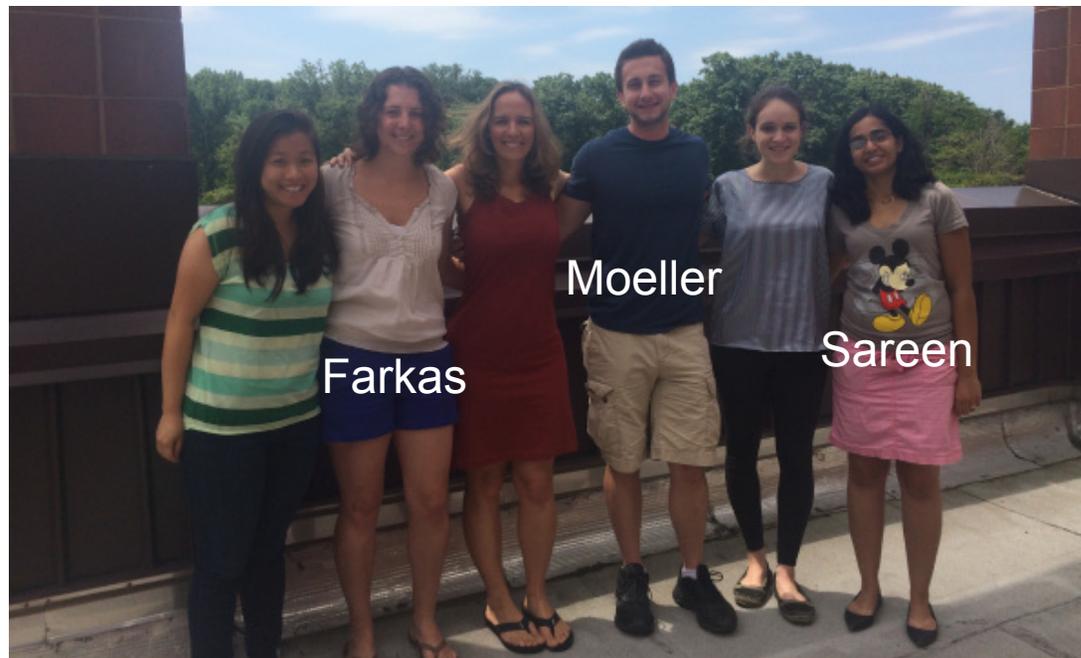
investigate vertical profile sensitivities

## EPA STAR Program

- John Dawson, Sherri Hunt, Wil Wilson

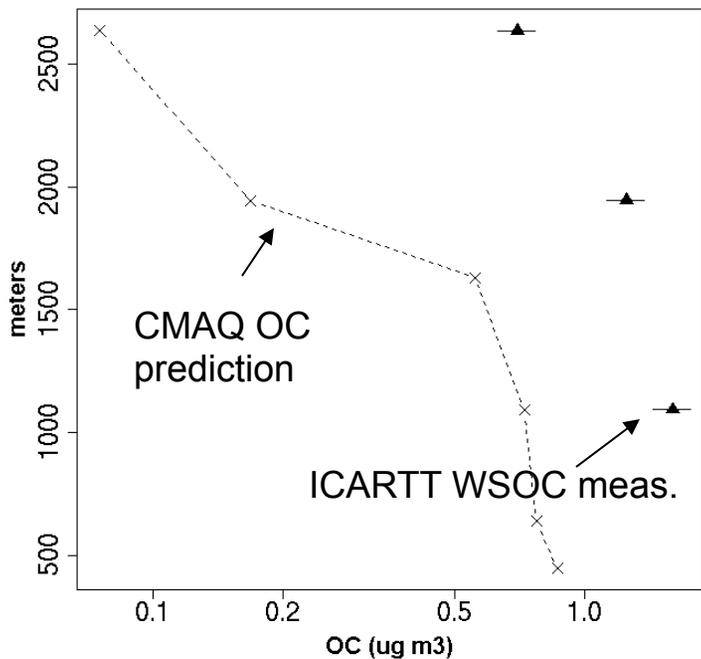
All the CMAQ and SMOKE model developers

Group Members: Brian Marmo, Neha Sareen, Caroline Farkas, Michael Moeller, Neha Sareen, Eleana Little

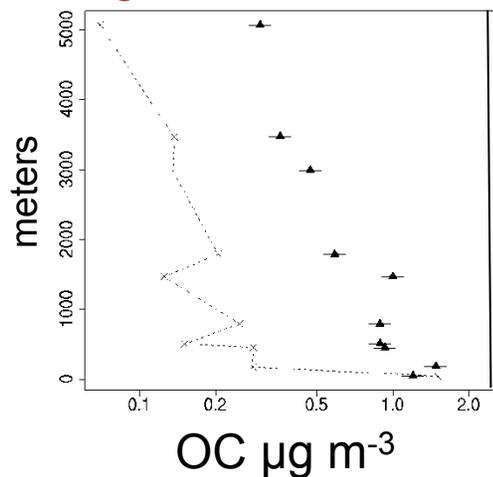




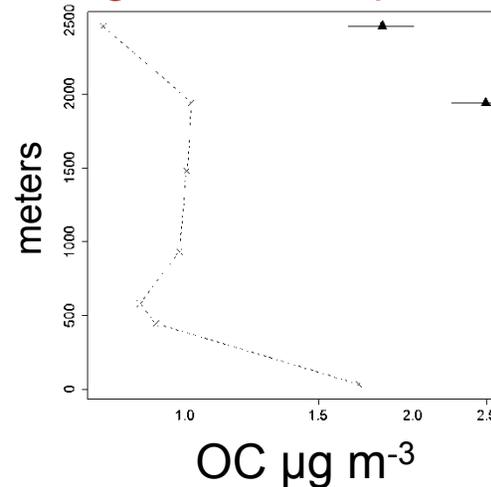
Aug. 3 – new england



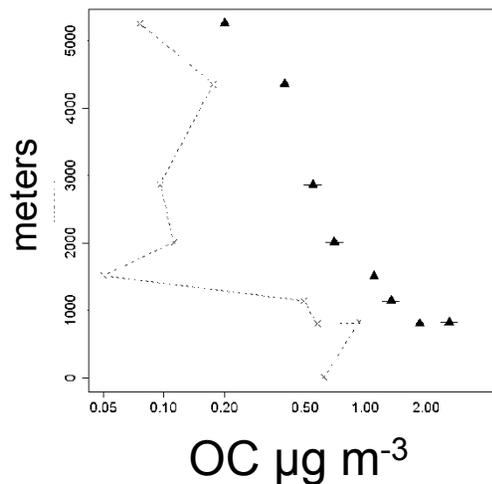
Aug. 14, 2004 - clouds



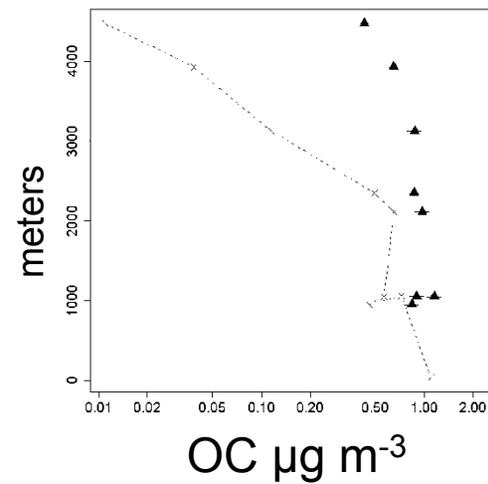
Aug. 11 – NYC plume



Aug. 15 transit to FL via Atlanta



Aug. 6 Ohio Valley power plants



# RUTGERS Multiphase chemistry: ignored at our peril

Atmospheric models have 100s of gas phase reactions, and ~5 aqueous phase reactions (often a trick to get gas phase concentrations right)

Catalytic properties of water ignored → Chapman cycle insufficient to describe stratospheric ozone

Aqueous phase  $\text{SO}_2$  oxidation → acid rain problem, unable to develop effective control strategies.

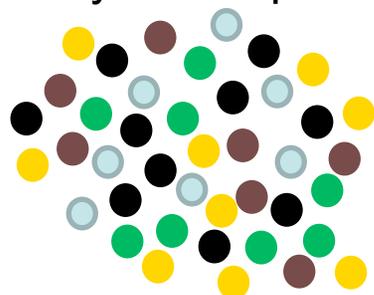
Heterogeneous chemistry on polar stratospheric clouds discovered → finally we completely understand the ozone hole.

**Hypothesis:** insufficient representation of multiphase organic chemistry leads to incorrect vertical profiles of particulate carbon in atmospheric models. This hinders development of effective strategies for air quality and climate.



Organics: can be primary (emitted) or secondary (formed in the atmosphere)

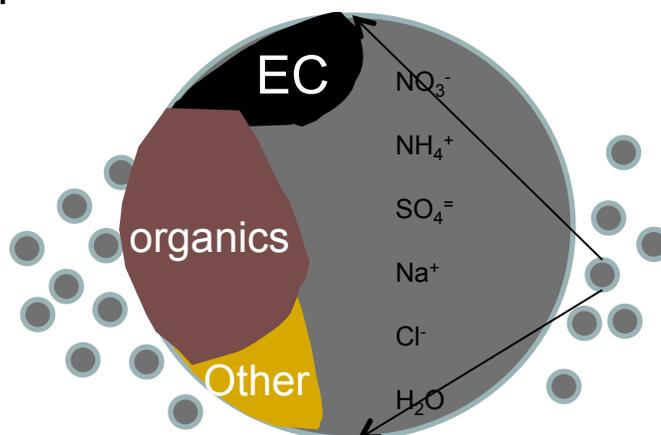
externally-mixed particle model



- other
- organic "brown" carbon
- black carbon
- nitrate
- sulfate

global climate models

internally-mixed particle model



regional-scale air quality models

hybrid



how BC is most often observed in the atmosphere

In climate models, BC only absorbing species (historically).