

# **Particulate Matter Modeling: Including Nanoparticles**

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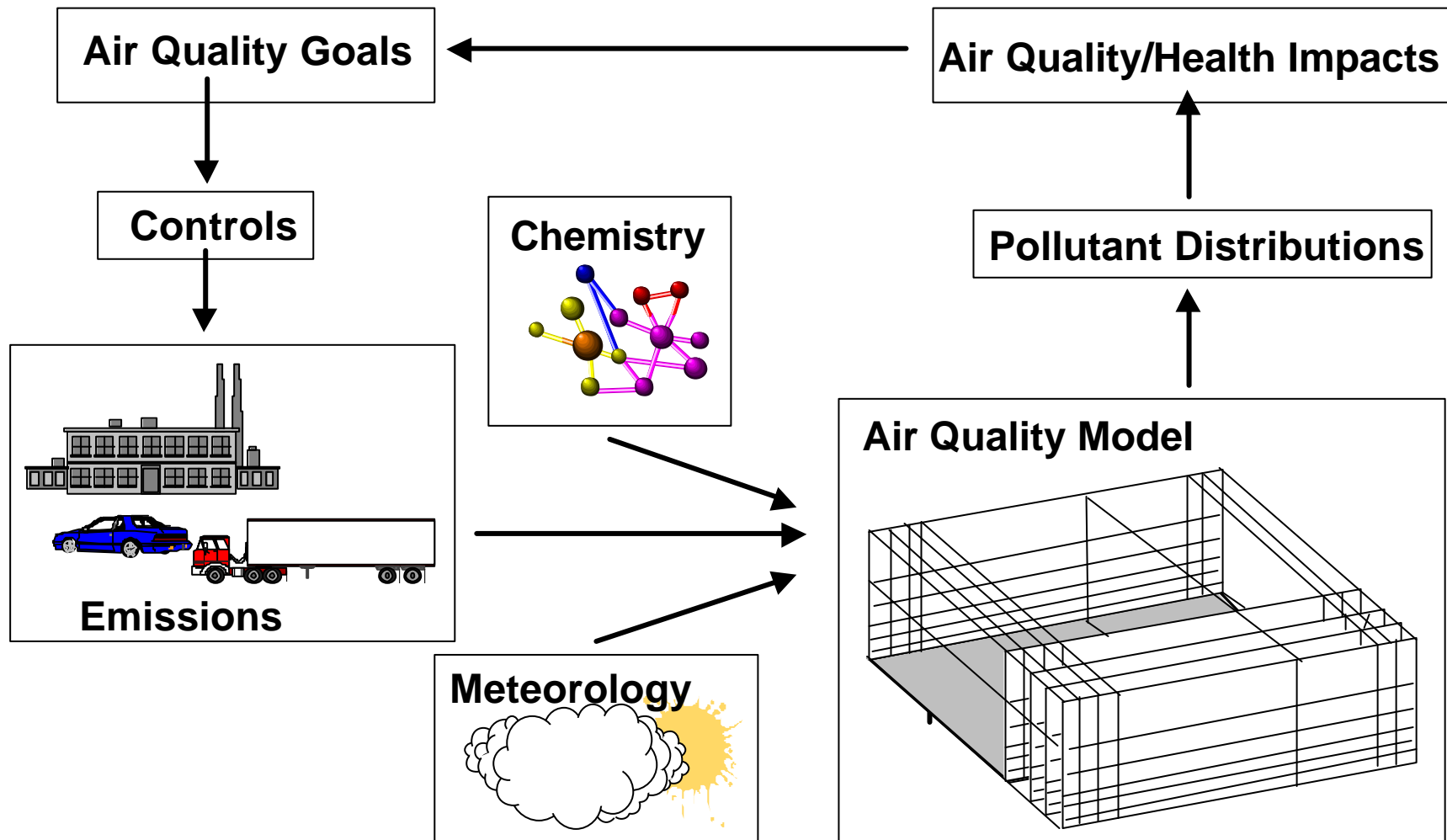
# Issues

- Much of the suspected health and welfare effects from air pollution due to particulate matter
  - Health (the main concern)
    - Morbidity and mortality concerns
    - Asthma
    - etc.
  - Welfare
    - Visibility
    - Deposition
- Particulate matter modeling has significant challenges
  - Modeling techniques in development
  - input/output uncertainties impact model evaluation

# Outline

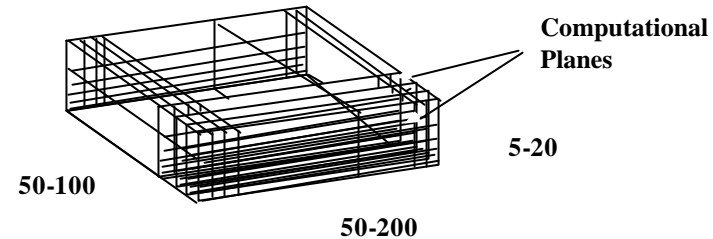
- Air quality modeling
  - Role
  - Scientific foundation
  - Model vs. process
- Particulate matter models
  - State of the science
  - Current research directions
- Conclusions

# Role of Air Quality Modeling In Air Quality Management



# Air Quality Model

- Representation of physical and chemical processes
  - Numerical integration routines
- Scientifically most sound method to link future emissions changes to air quality



## Air Quality Model

$$\frac{\partial c_i}{\partial t} = -\nabla \cdot (u c_i) + \nabla \cdot (K \nabla c_i) + R_i + S_i$$

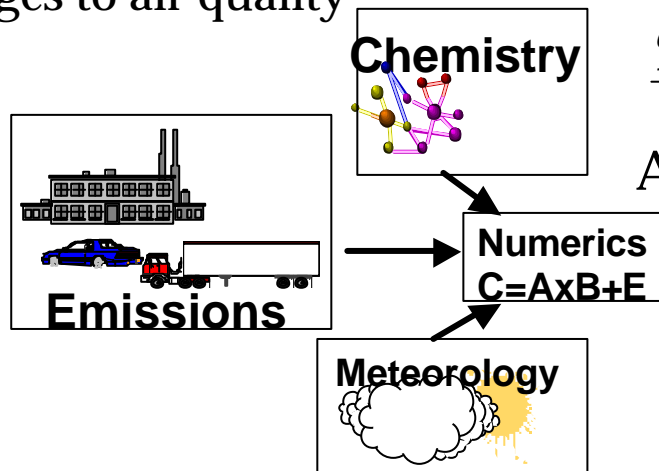
Atmospheric Diffusion Equation

Discretize

$$\frac{\partial c}{\partial t} + L(\mathbf{x}, t)c = f(\mathbf{x}, t)$$

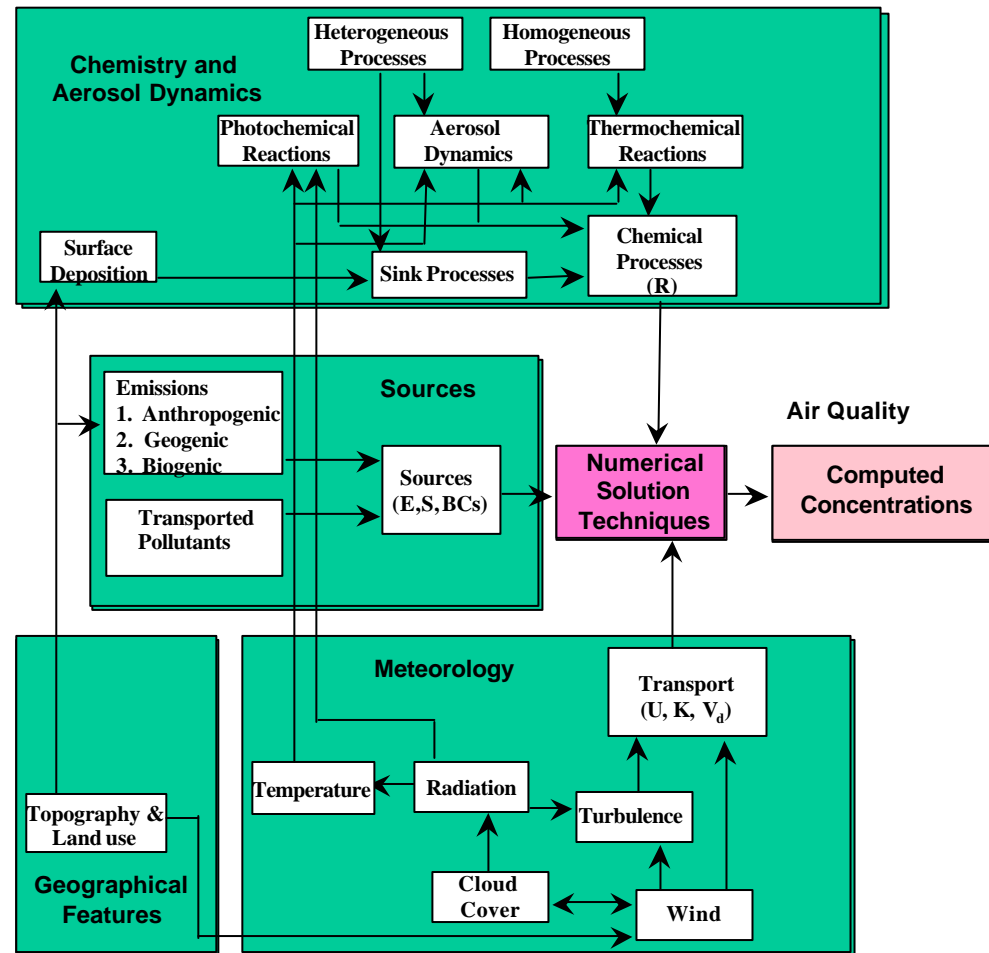
Operator splitting

$$c(t+2\Delta t) = L_x(\Delta t) L_y(\Delta t) L_{cz}(2\Delta t) L_y(\Delta t) L_x(\Delta t) c(t)$$

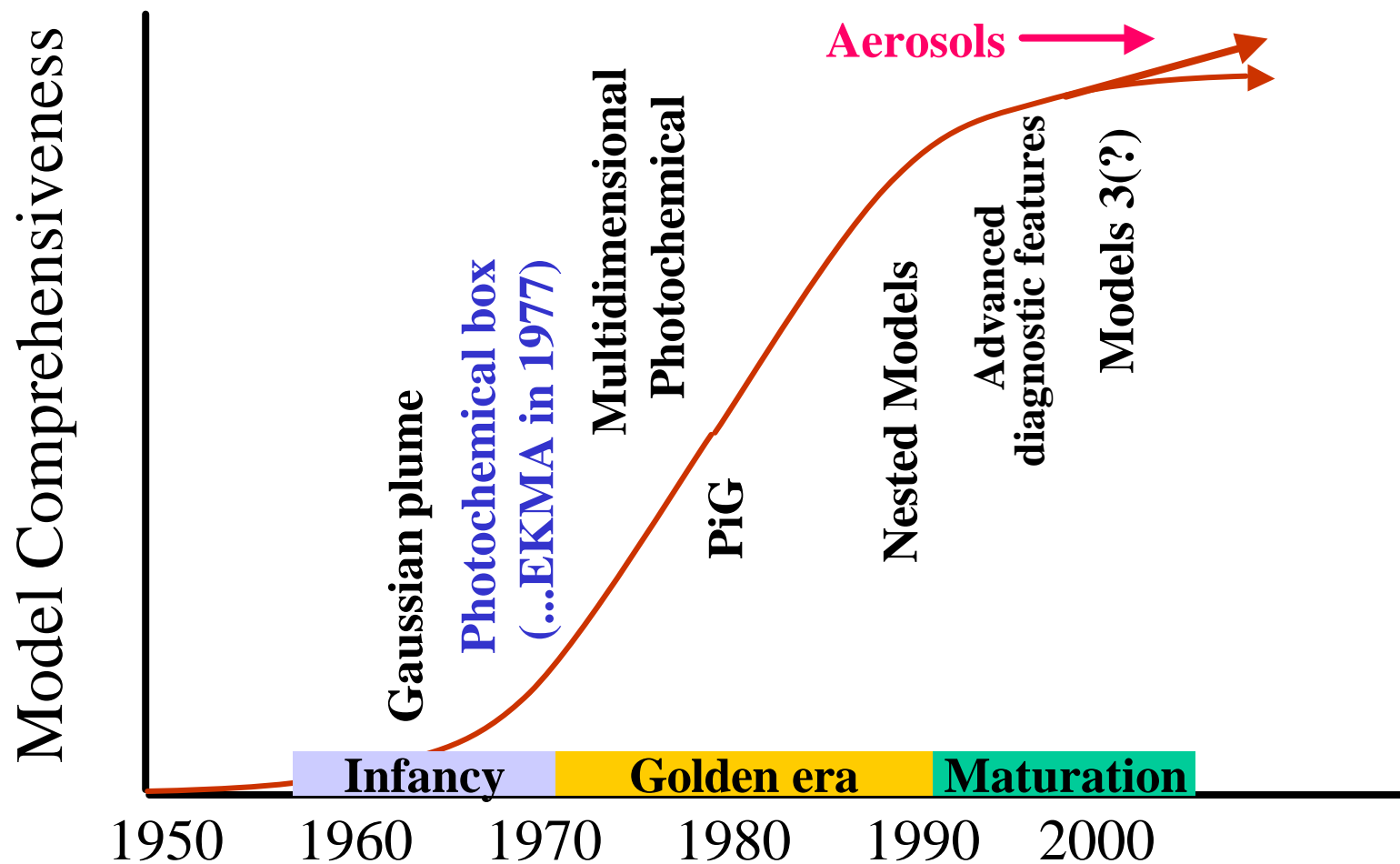


100 species x 5000 hor. grids x 10 layers = 5 million coupled, stiff non-linear differential equations

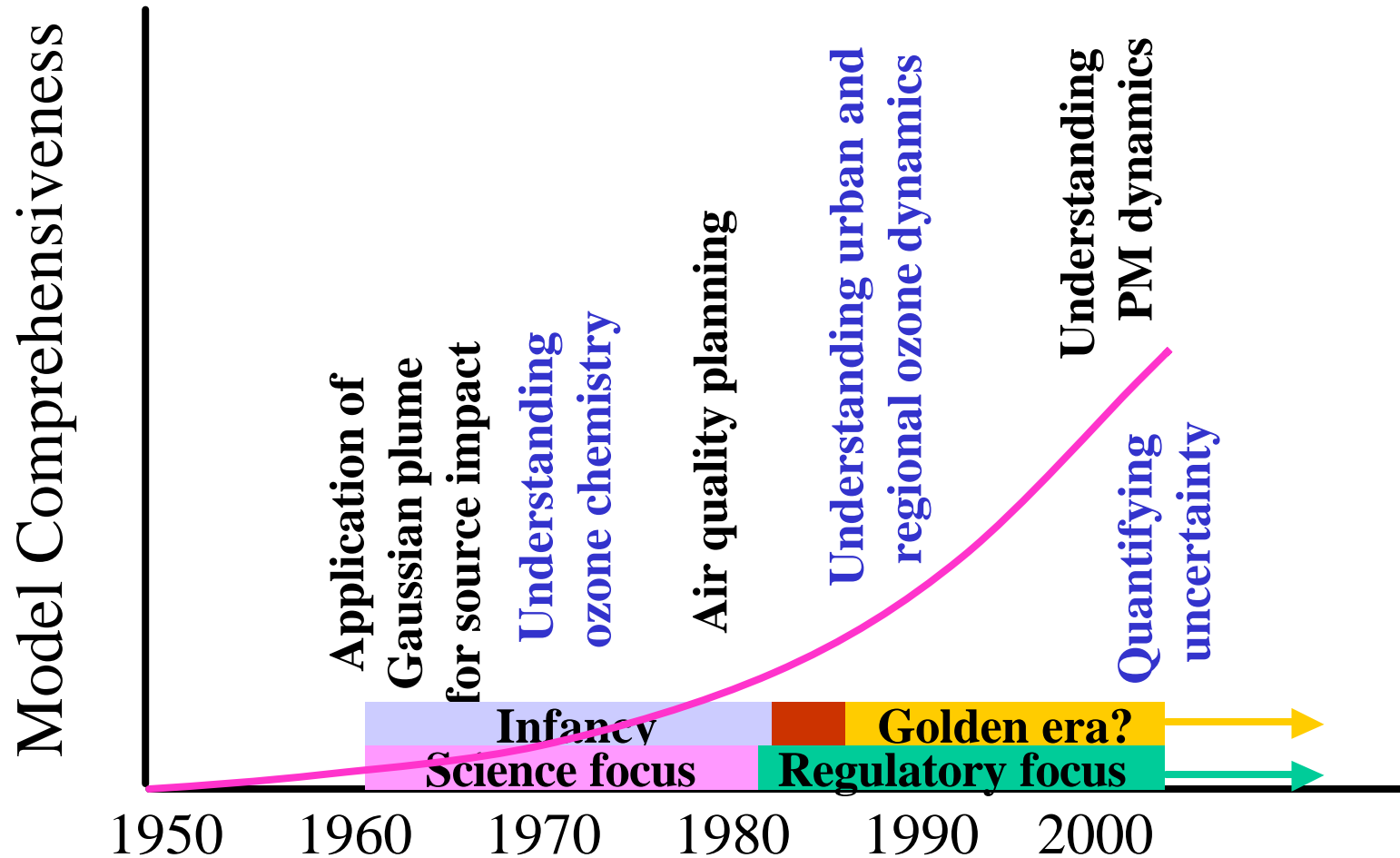
# Air Quality Model



# Evolution in Air Quality Model Development



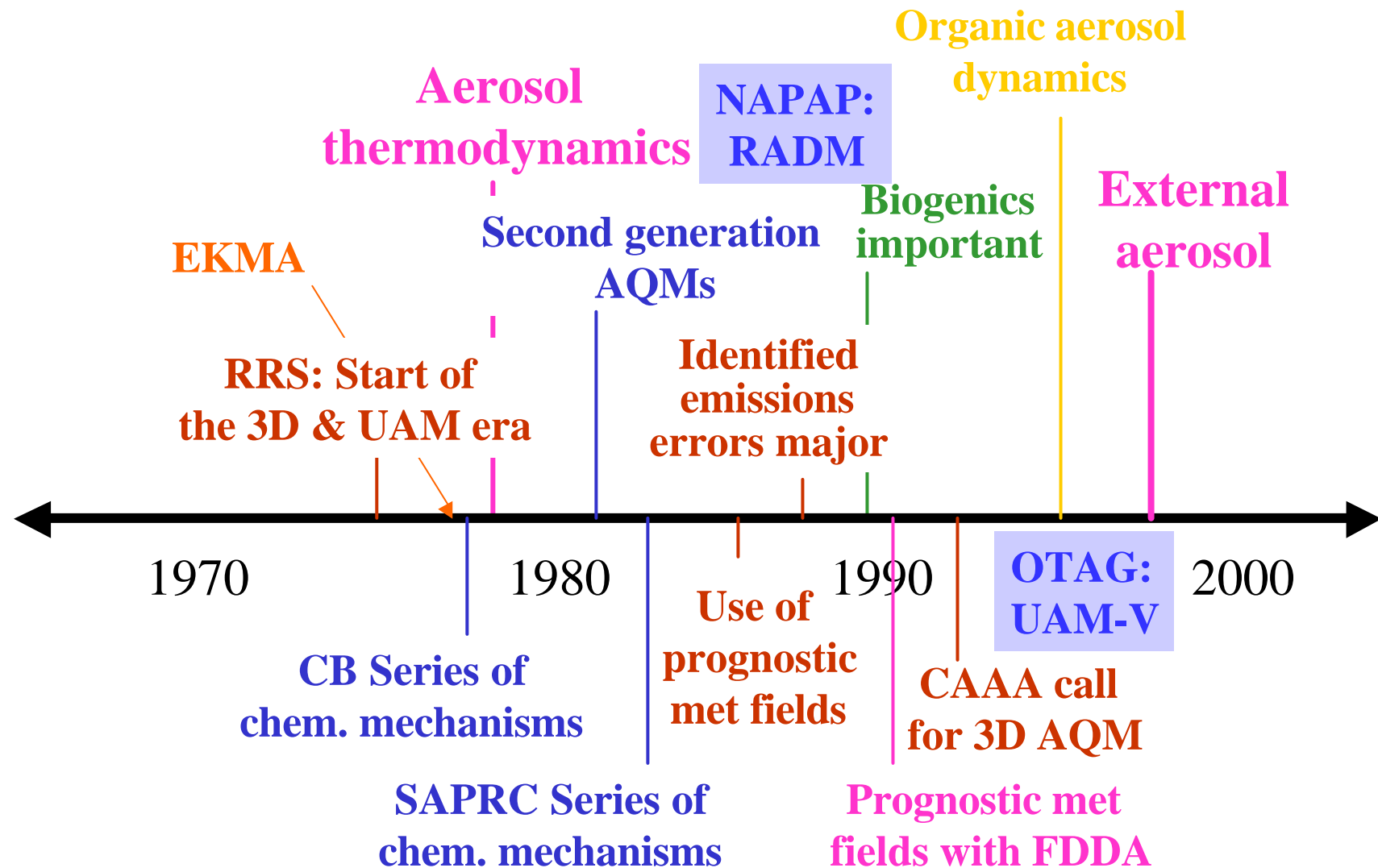
# Evolution in Air Quality Model Application



**\*or denial**



# Important Milestones



# How Good Are They?

- All evidence suggests that they describe the processes most affecting the evolution of ozone and (if equipped) particulate matter (o.k., many components of PM) after pollutant emission
- Current limitations
  - Input errors
    - Emissions
    - Meteorology
  - Monitoring data
    - Sparse, ground level
      - Don't effectively use upper-air data
  - Model components/formulation/design

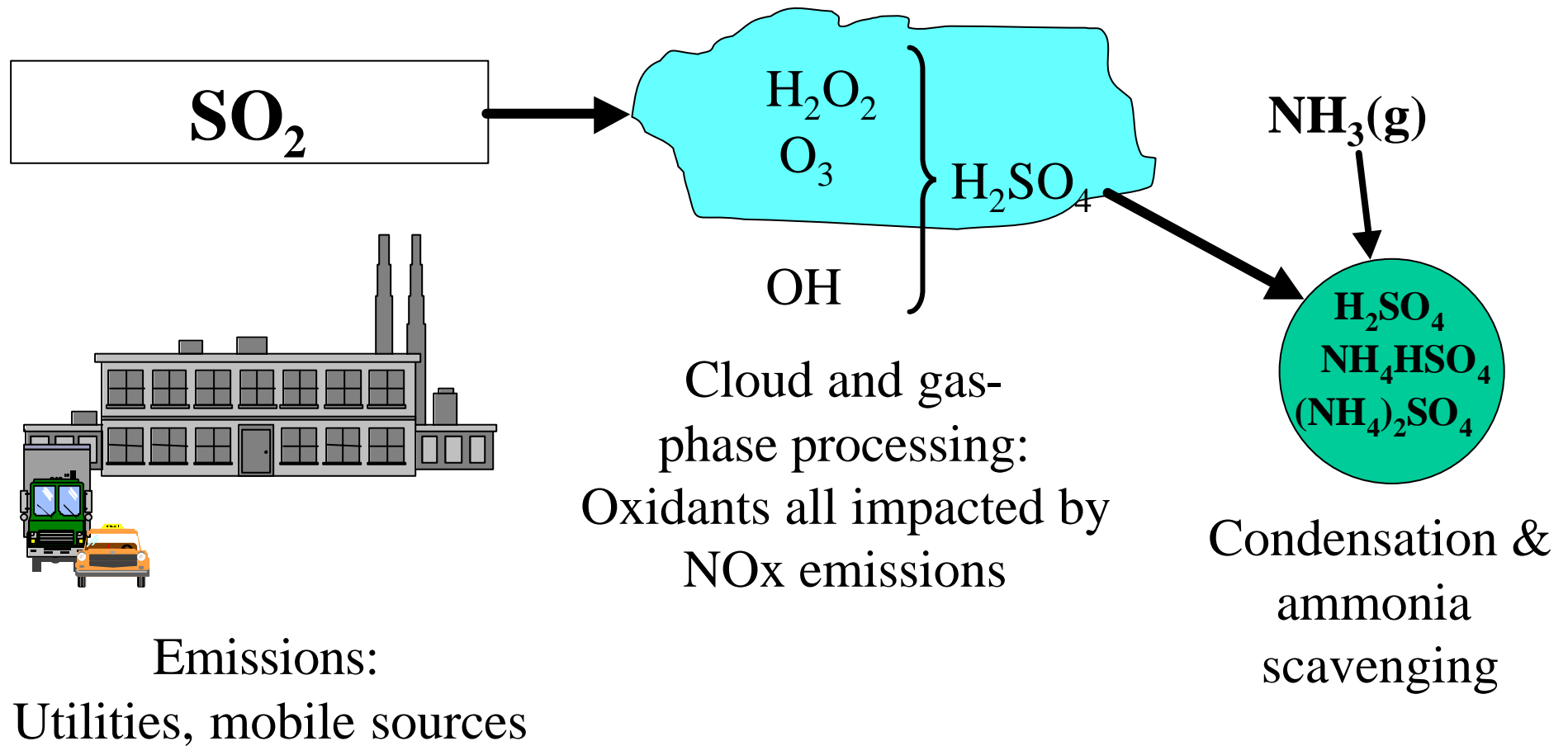
# Particulate Matter Dynamics

- Particulates are exceptionally complex
  - Complete description must include size and chemical composition
    - Continuous size distribution
    - Chemical composition varies continuously with size
    - Phase conversion important
  - PM function concentration function is more complex:
    - $C(x,t,d_p)$ : space, time and particle diameter
      - Composition may not be uniform for a given size:  $C(x,t,d_p, s_i)$ :  $s_i$  is source  $i$
  - **Makes ozone modeling look really easy**

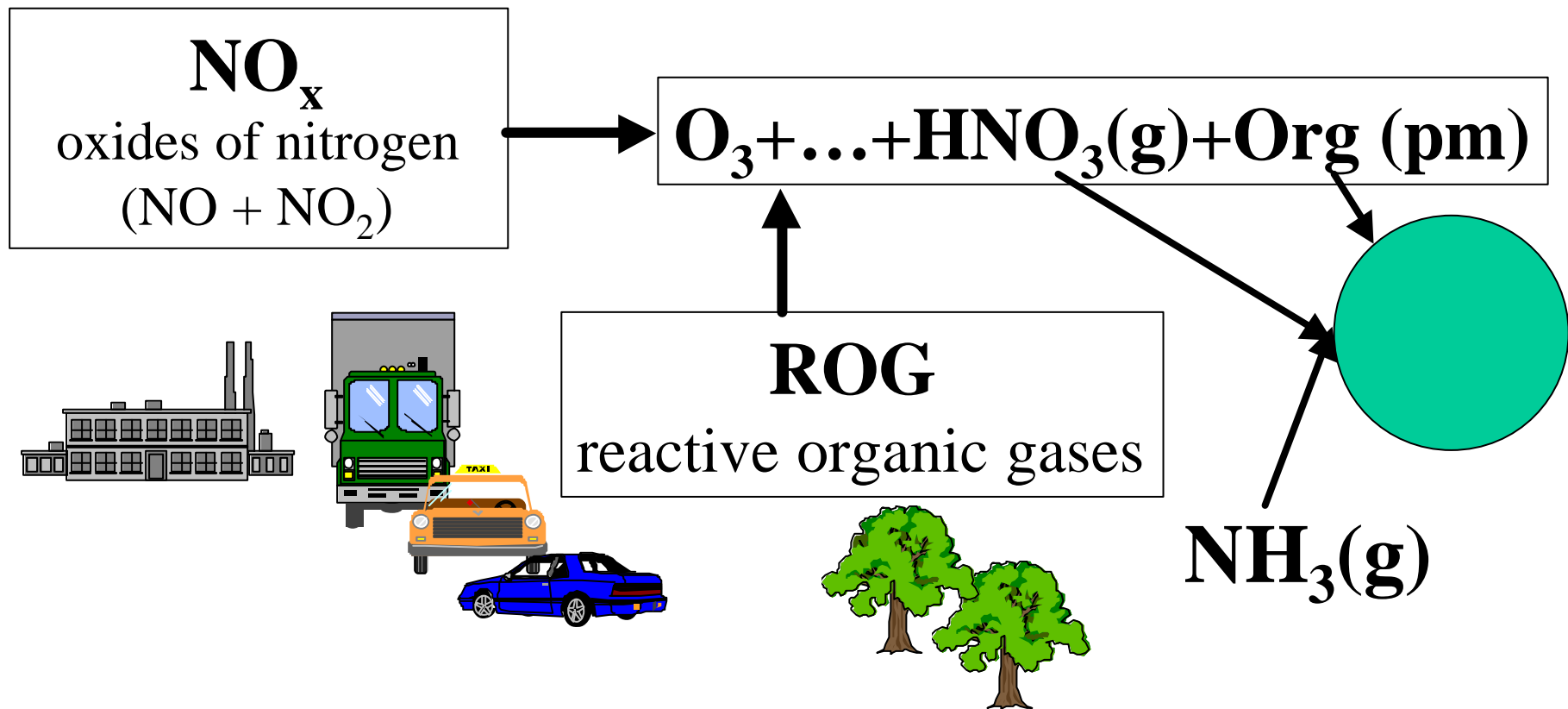
# Sources of Particulate Matter

- PM has both primary and secondary components
  - Primary
    - Organic & elemental carbon (OC/EC), crustals, metals, water
    - Mobile sources, industry, utilities, dust
  - Secondary
    - Sulfate, nitrate, ammonium and organic carbon
    - Utilities, mobile sources, industry, biogenic, fertilizer, emissions control equipment

# Particulate Sulfate Formation

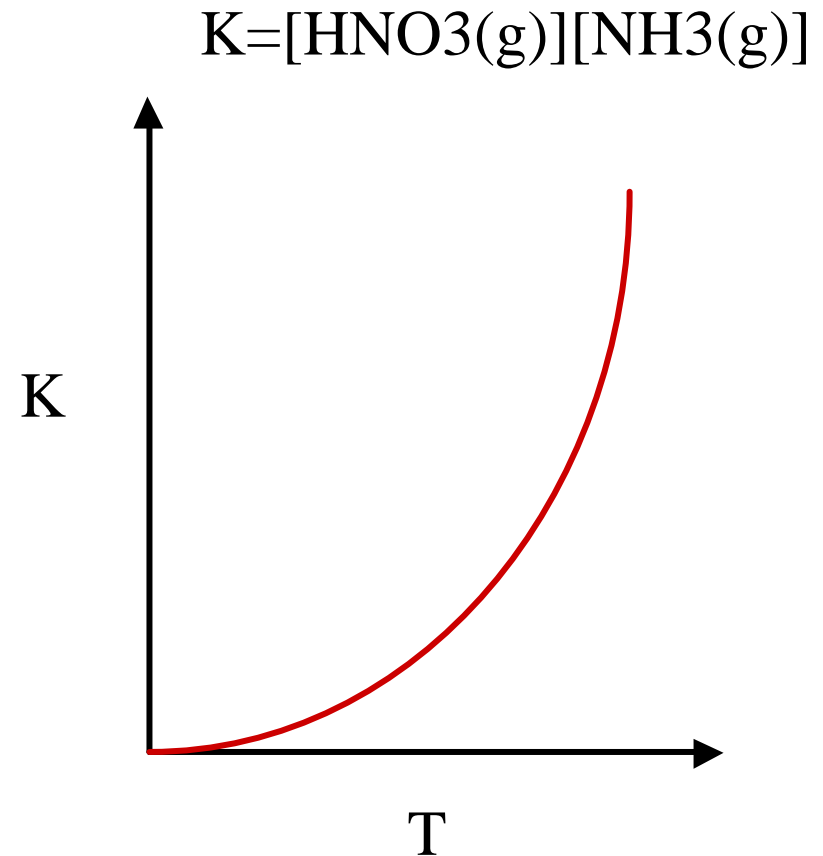


# Particulate Nitrate & OC Formation



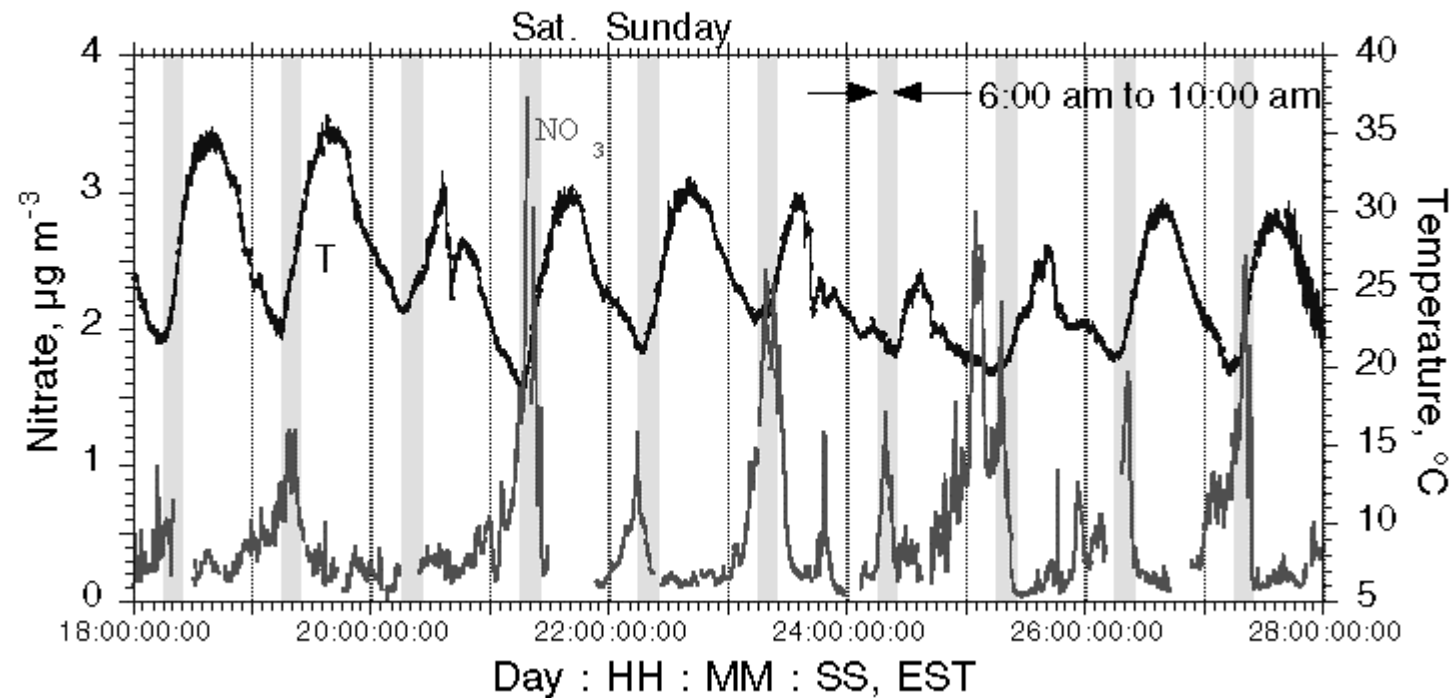
# PM Nitrate Formation

- Gaseous nitric acid formed from NO<sub>x</sub> emissions
- Ammonia derived directly from emissions
- Combine via equilibrium reaction
  - Sensitive to temperature



# Diurnal Nitrate Pattern

Atlanta Supersite Study, August 1999



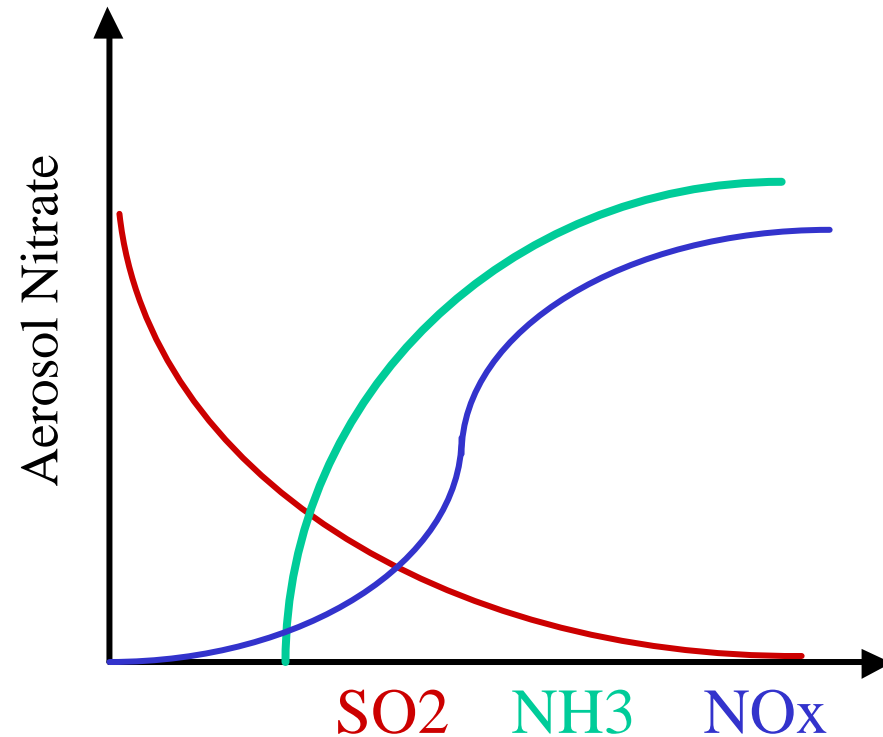
Source: R. Weber

Georgia Institute of Technology

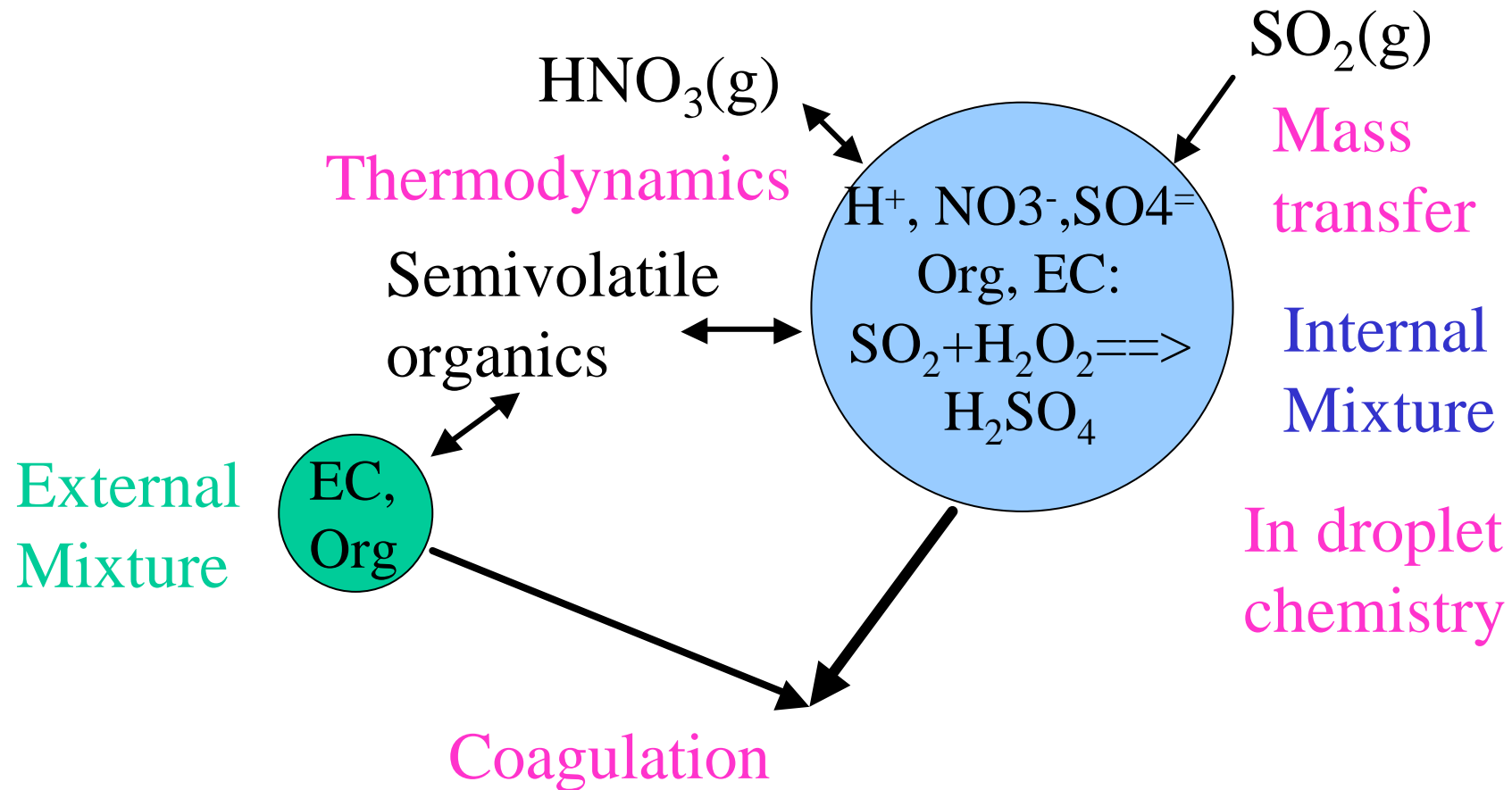


# PM Nitrate Formation

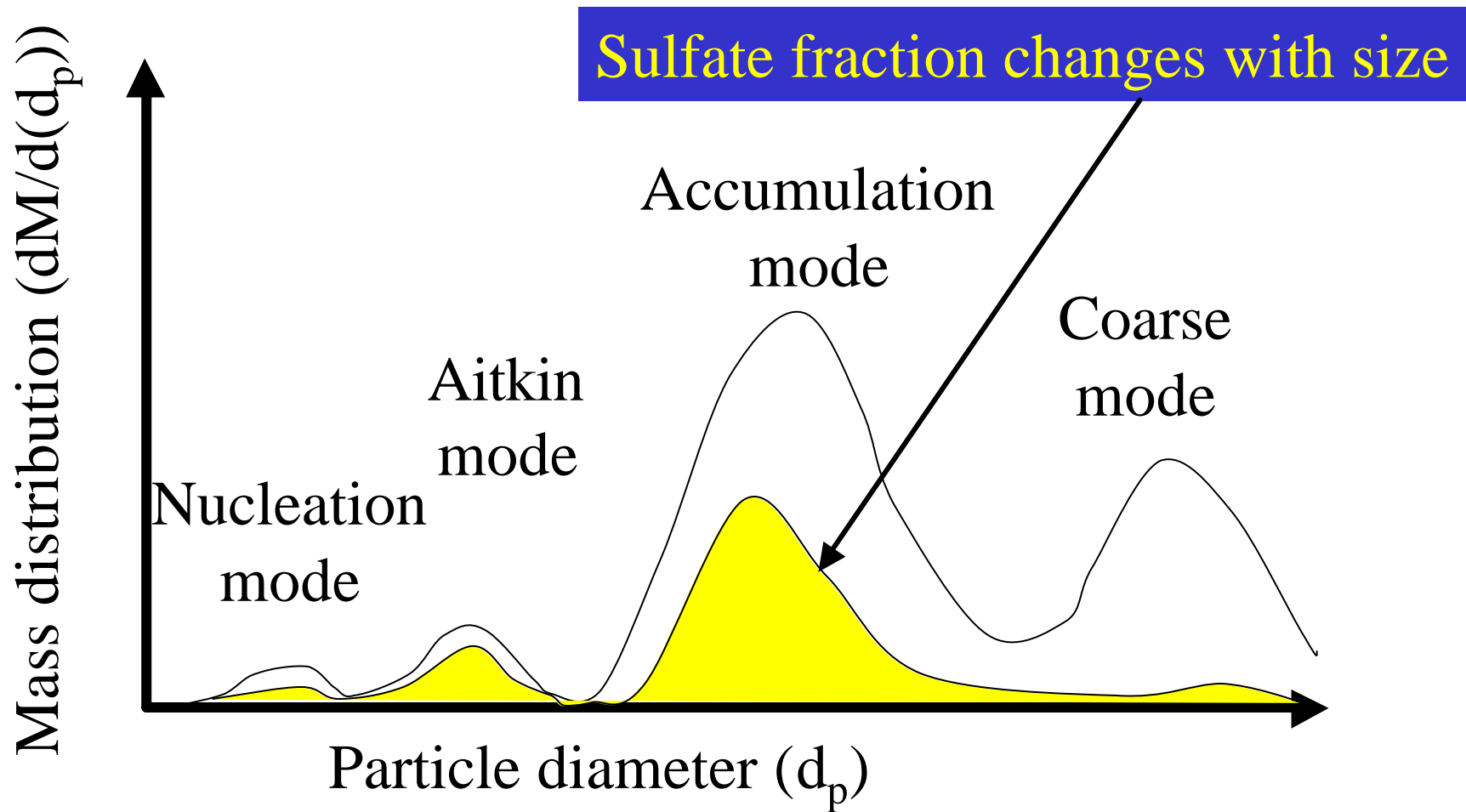
- Nitric acid reacts with (free) ammonia
  - As ammonia emissions increase, nitrate will increase until gas phase nitric acid depleted
  - Sulfate reduces free ammonia/increases acidity, reducing nitrate formation
- Reducing NO<sub>x</sub> will decrease HNO<sub>3</sub> formation, but may not decrease PM nitrate much



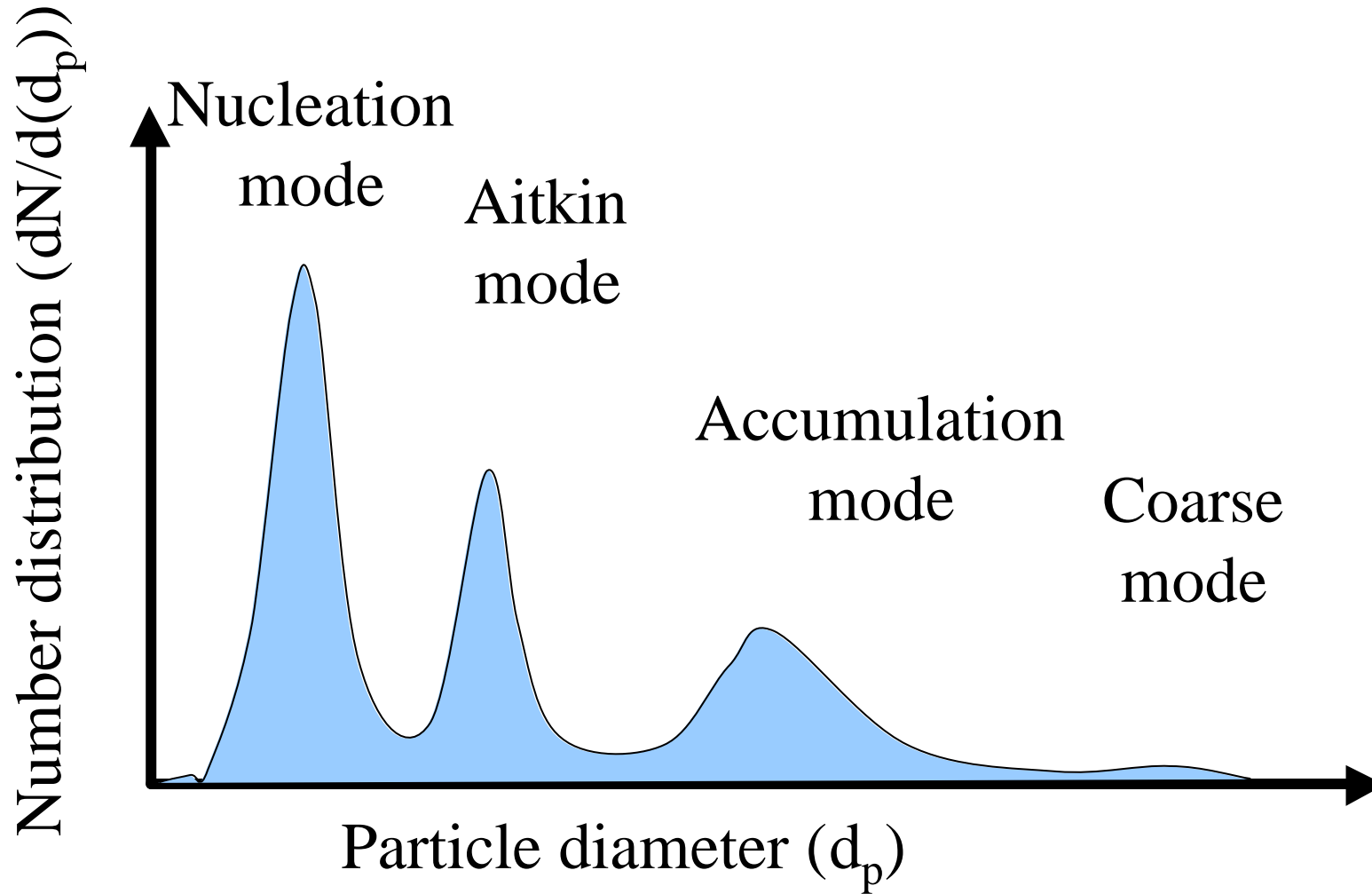
# Particulate Matter Dynamics



# Particle size distribution



# Particle number distribution



# Particulate Matter Modeling Approaches

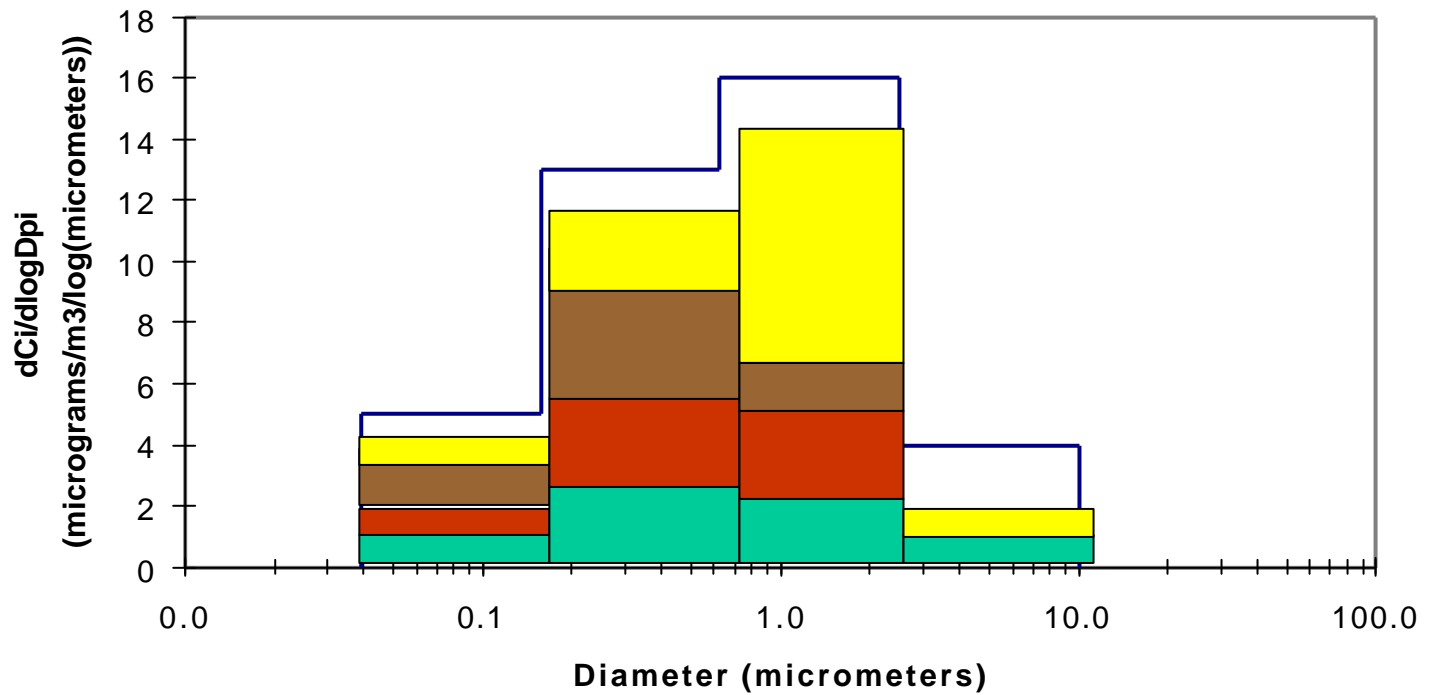
- Size distribution
  - None
  - Sectional
  - Modal
- Gas-to-particle conversion
  - Inorganic
  - Organic
- Aerosol particle description
  - Internal mixture
  - External mixture

# Size Distribution

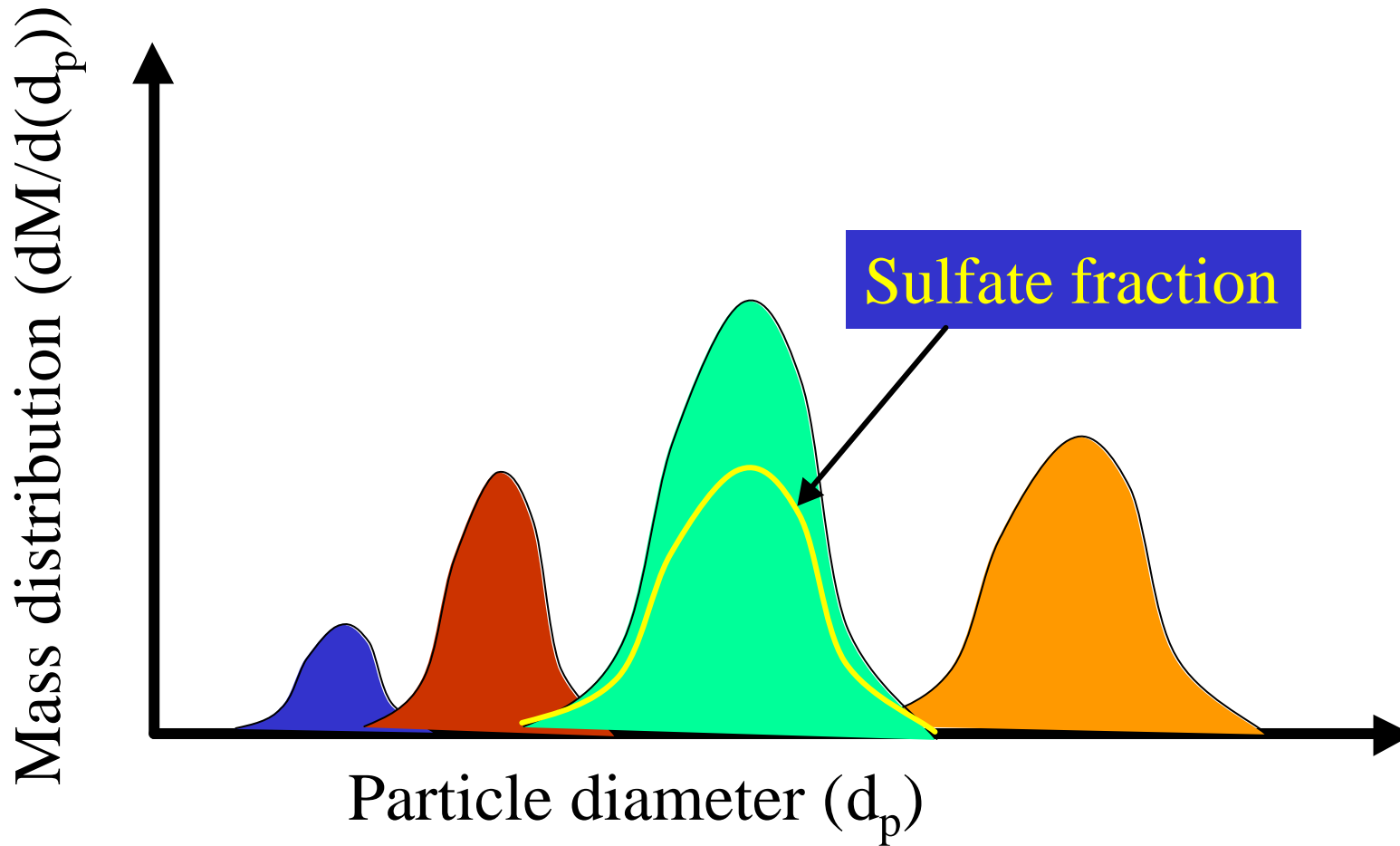
- No description
  - All PM is together: no information on size or composition as a function of size
- Sectional
  - Size distribution made up of a user defined number of bins
    - Can have many bins (>20) or few (4)
    - Describes compositional changes as a function of size
- Modal
  - Size distribution made up of 2-4 “modes” corresponding to modes in size distribution
  - Mode shaped like log-normal profiles

# Sectional Approach

Aerosol Histogram



# Modal Approach





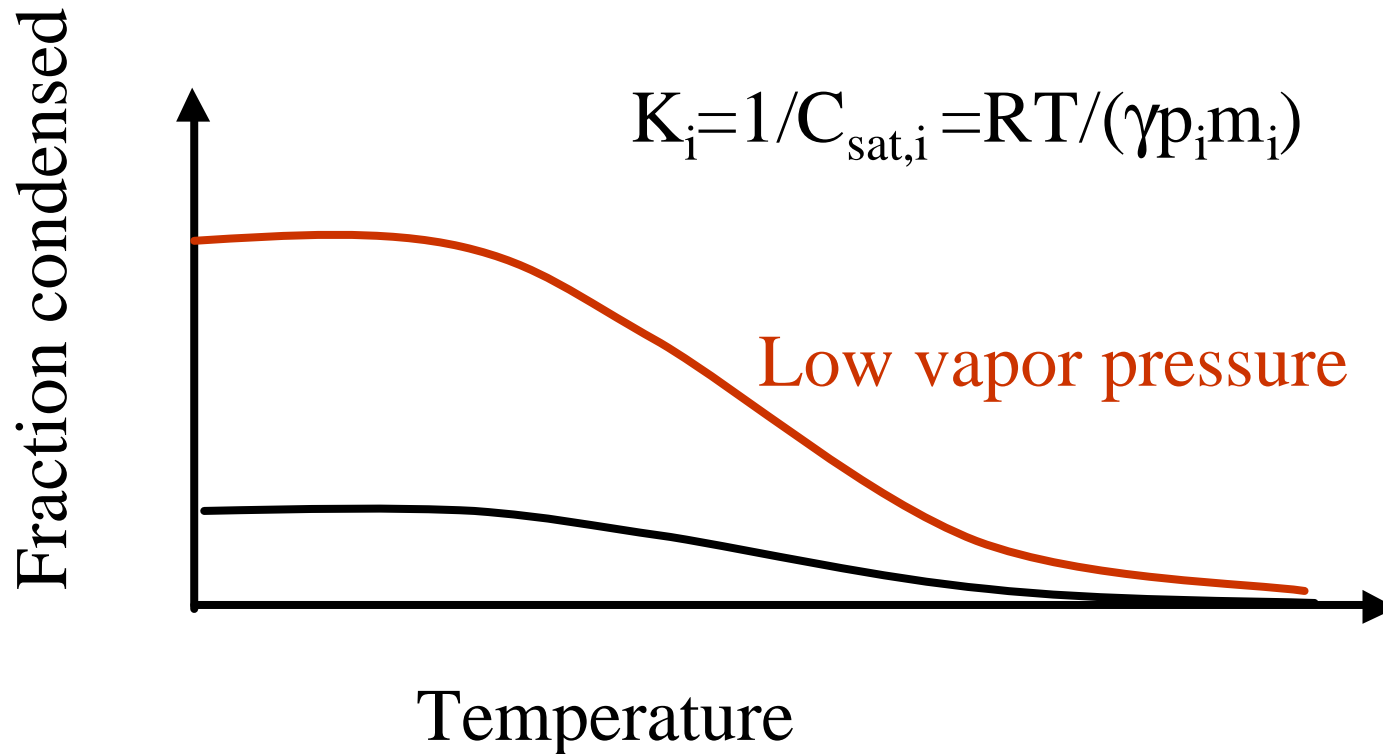
# Gas-to-Particle Conversion

- Gas phase species can condense upon, and volatilize from, particulate matter
  - Inorganics
    - Thermodynamic equilibrium usually assumed
      - ISORROPIA
      - AIM
  - Organics
    - Semivolatiles and low-vapor pressure organics
    - One and two-step approach
      - One step: gas phase chemistry leads to condensable species which goes to particulate phase
      - Two step: gas phase chemistry leads to semivolatile product that partitions between gas and condense phases

# Organic Partitioning Coefficient

$$\text{Yield} = M_0 [\alpha K_i / (1 + K_i M_0)]$$

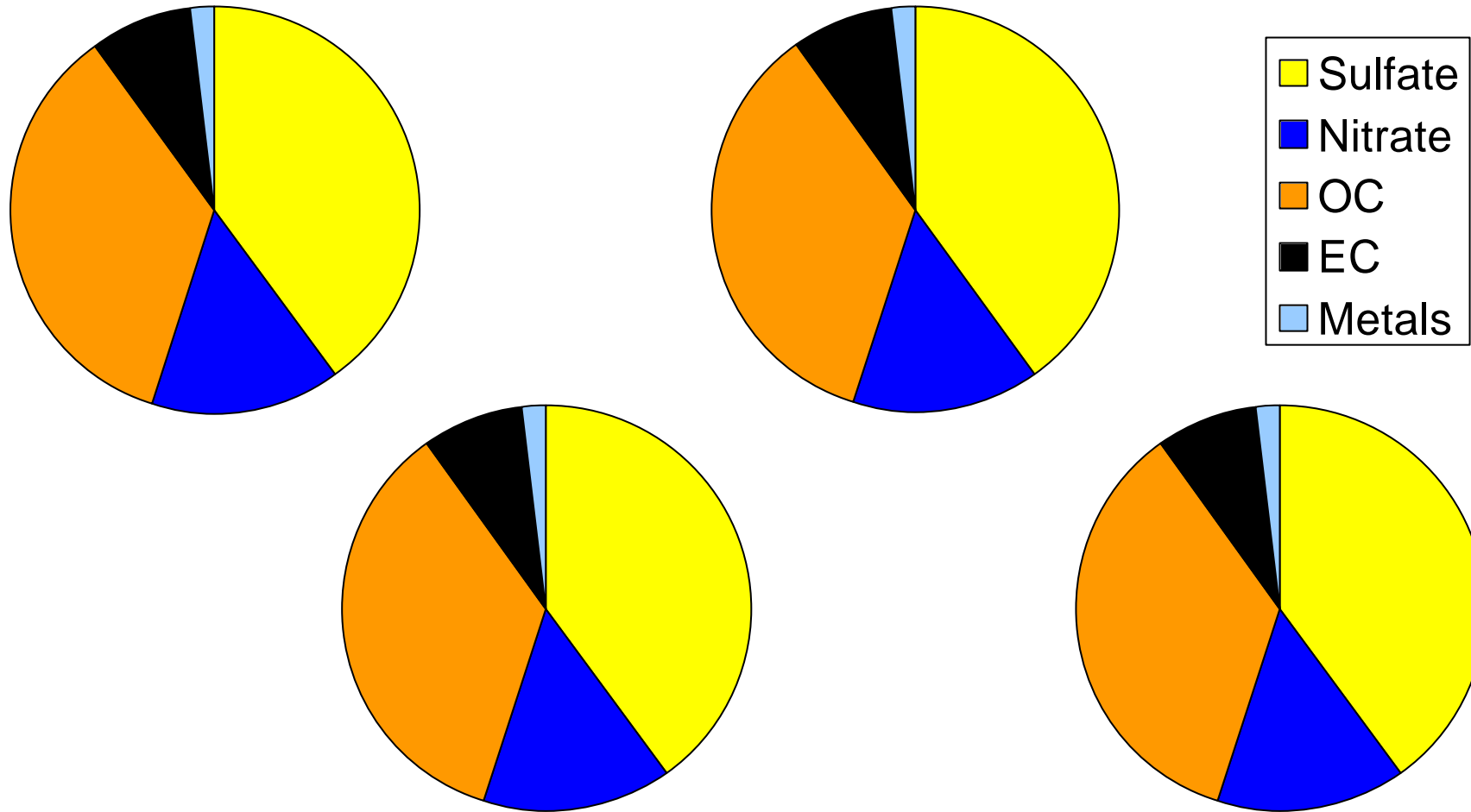
$$K_i = 1/C_{\text{sat},i} = RT / (\gamma p_i^* m_i)$$



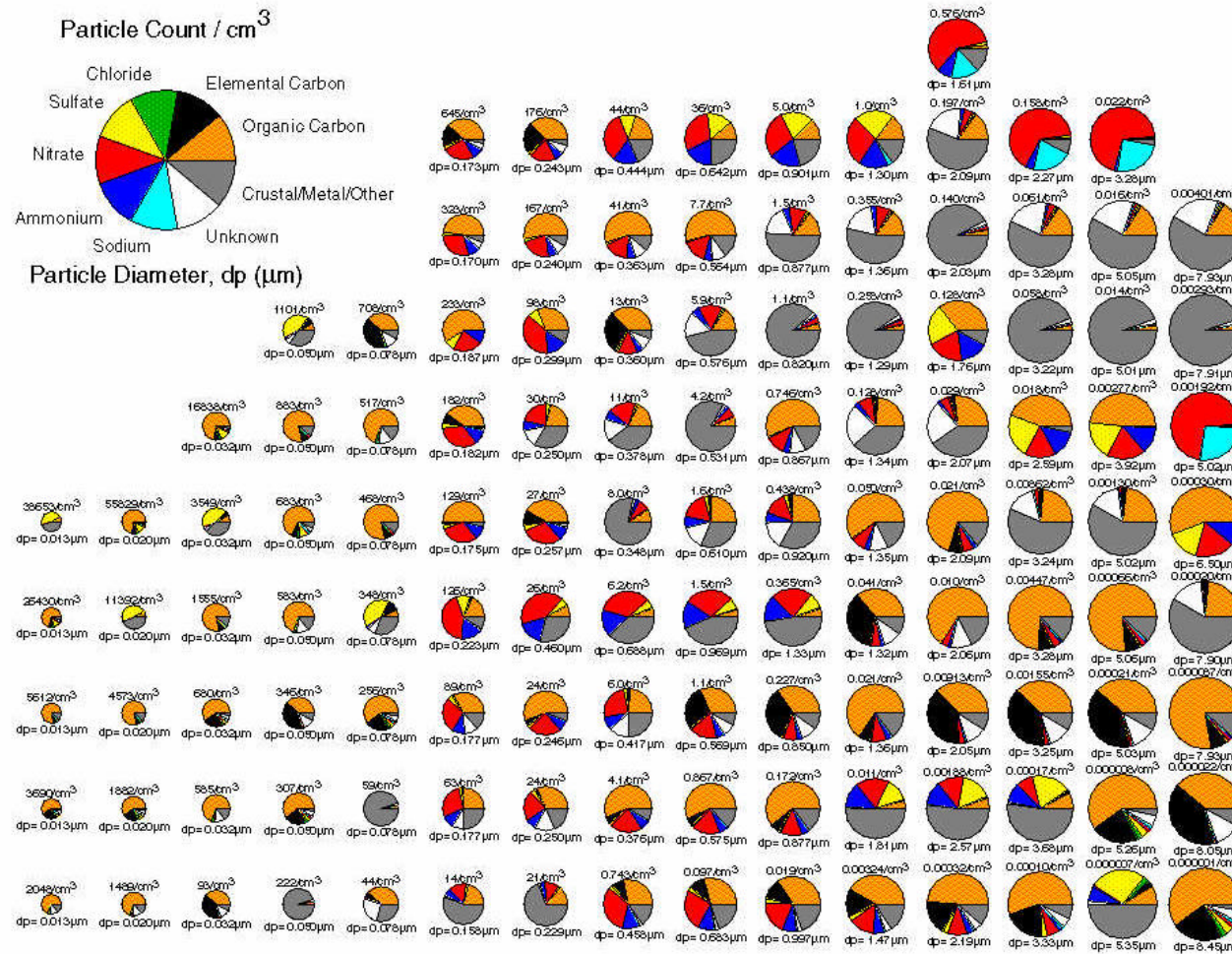
# Internal vs. External Mixtures

- Particle composition can be very inhomogenous even in the same size distribution
  - Traditional approaches assume homogenous mixture in each size range/bin:  $C(x,t,d_p)$ :
    - “Internal mixture”
    - See prior slides
  - Theory and evidence suggests that particle composition varies within a size range
    - Source-based differences:  $C(x,t,d_p, s_i)$

# Internal Mixture



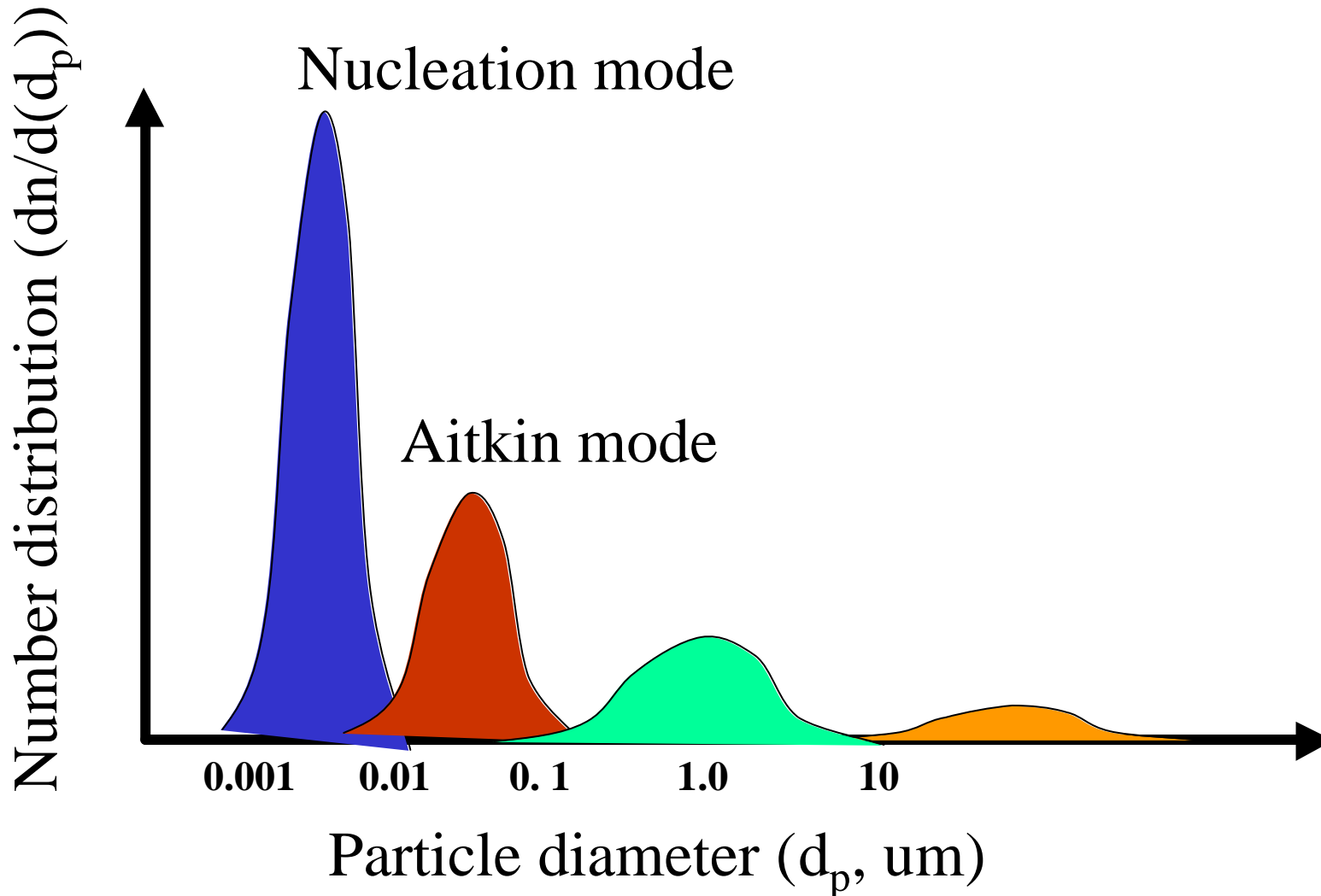
# External Aerosol Modeling



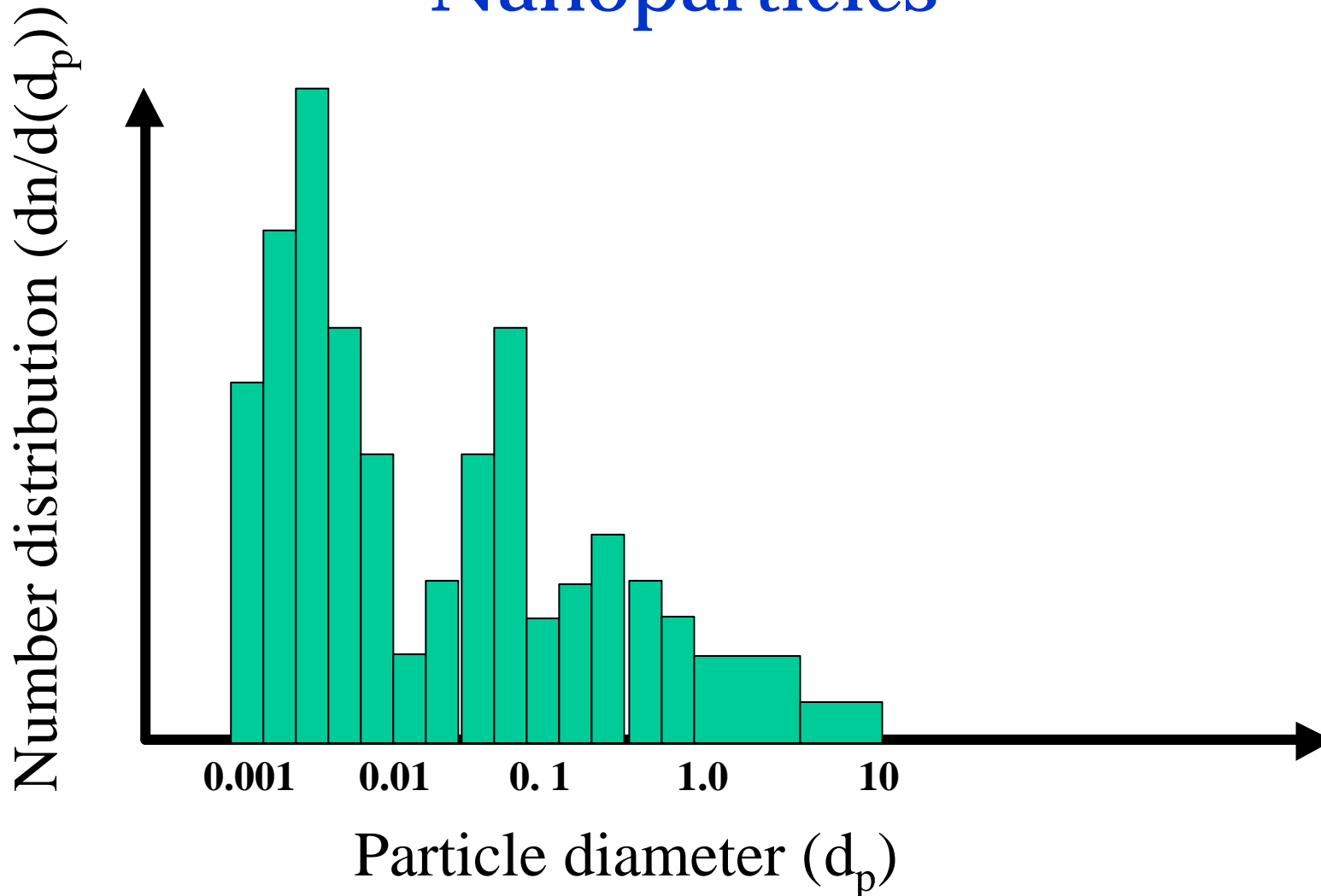
# Nanoparticle Modeling

- Nanoparticles represent an important fraction, in terms of total number but not total mass, of PM, and are unique
  - Very short lifetimes
  - Directly emitted or, possibly, due to nucleation in short term events
- Models have not dealt so much with nanoparticles because of their short lifetimes and small fraction of the mass
- Three approaches for modeling:
  - Sectional
    - Can add multiple sections in the nano-modes
  - Modal
    - Adding a new nucleation mode in addition to Aitkin mode
  - External, source oriented approach

# Modal Approach to Nanoparticles



# Sectional Approach for Nanoparticles





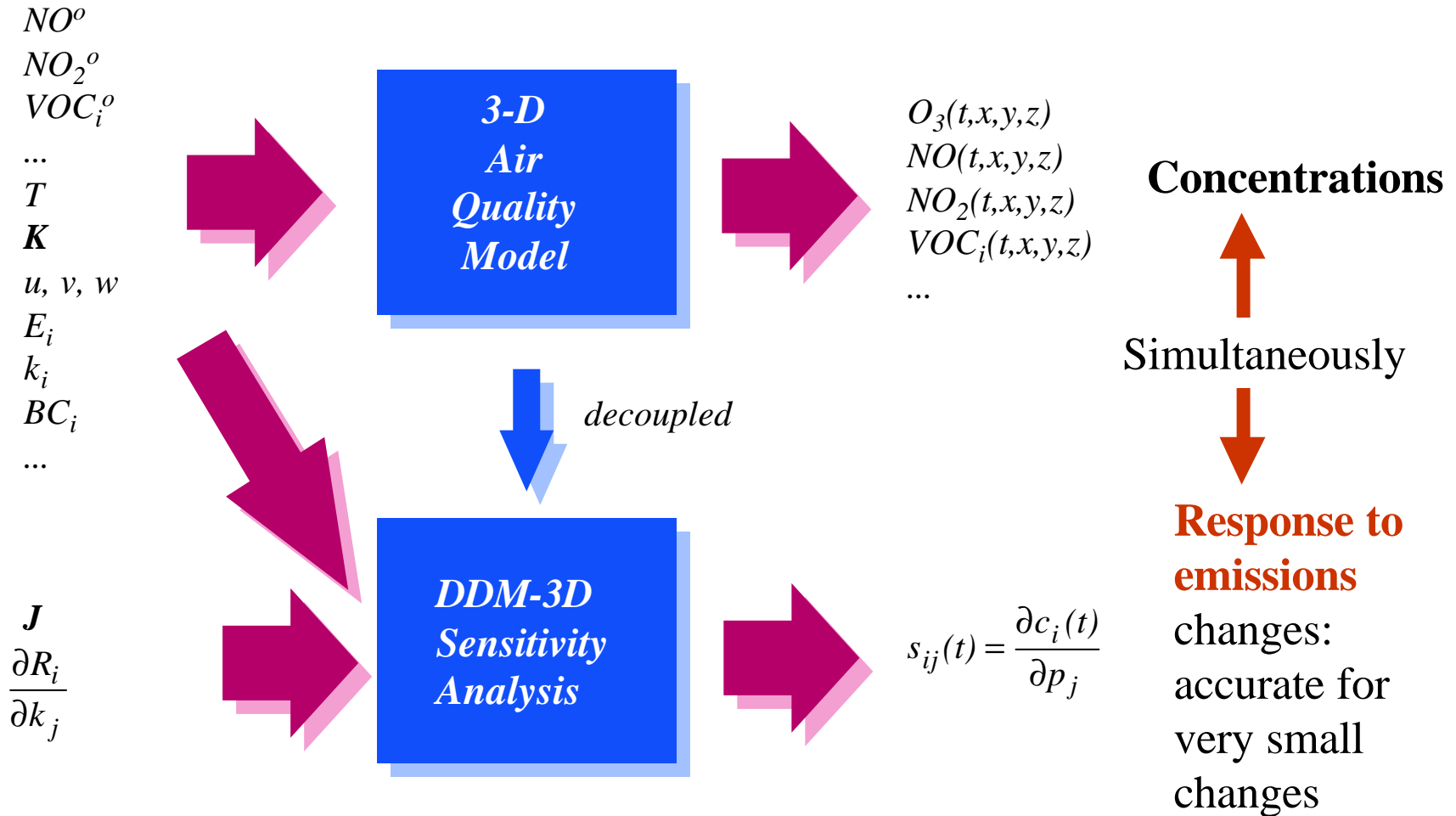
# Strengths and Weaknesses

- Modal
  - Strengths
    - Computationally efficient
  - Weaknesses
    - Lack of detailed information (all nano-particles similar)
- Sectional
  - Strength: Tremendous capacity for detail, very flexible
  - Weakness: Computationally time consuming
- External mixture
  - Strengths: Tremendous detail, particles tied directly to sources
  - Weakness: Computationally expensive
- All
  - **Nucleation theory is highly uncertain**
    - Not a major factor if particles are primary in origin

# Particulate Matter Sensitivity Analysis and Source Attribution

- AQM's major function is to link source emissions to air quality: Source attribution
    - Individual vs. regional/category analysis
      - Assessing impact of individual sources difficult
        - Small perturbation to noisy process
        - Small difference between two large numbers
          - » e.g.: 10 Ton/day source in a 1000 ton/day area
- $(10 \text{ ton/day}/1000 \text{ ton/day}) * 0.1(\% \text{ change in O}_3/\% \text{ change in NO}_x) * 120 \text{ ppb} = 0.12 \text{ ppb}$**
- Can a model “see” this accurately?
- Assessing categories/regions/complete strategies more appropriate for typical approach if reductions are reasonable
    - Unrealistic changes to minimize noise raises additional issues
  - New approach: direct sensitivity analysis

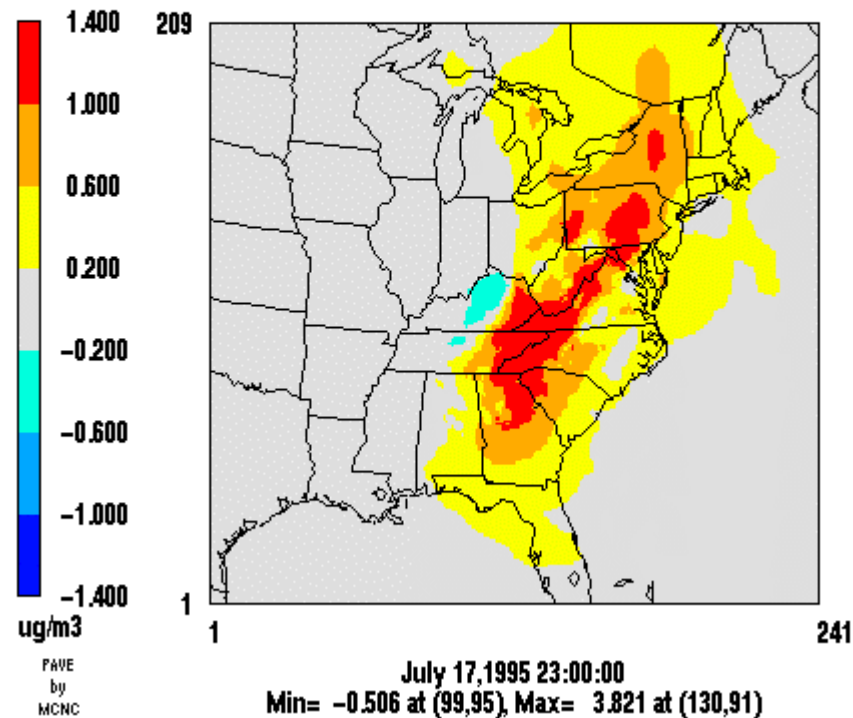
# Source Attribution using Direct Sensitivity Analysis



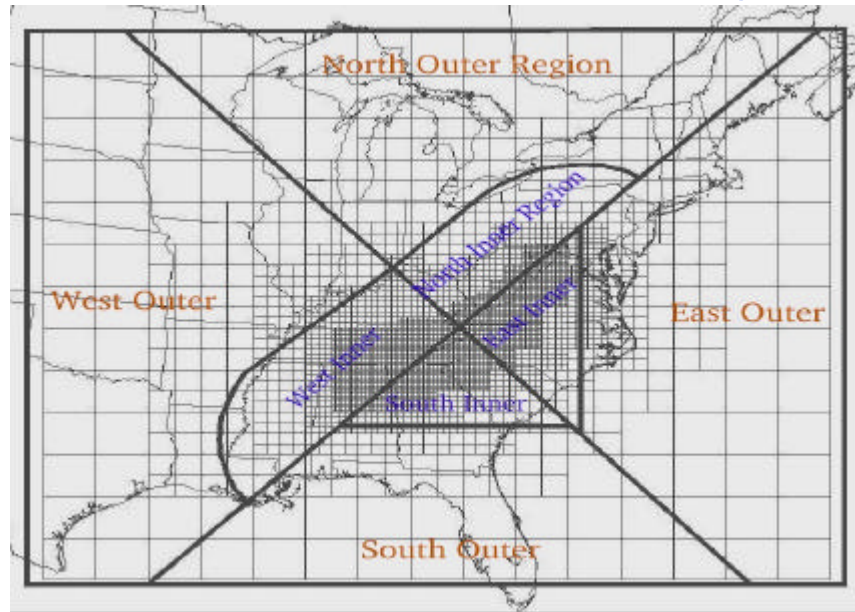
# Response of Fine Nitrate to SO<sub>2</sub> reductions

## Change in Nitrate Aerosol

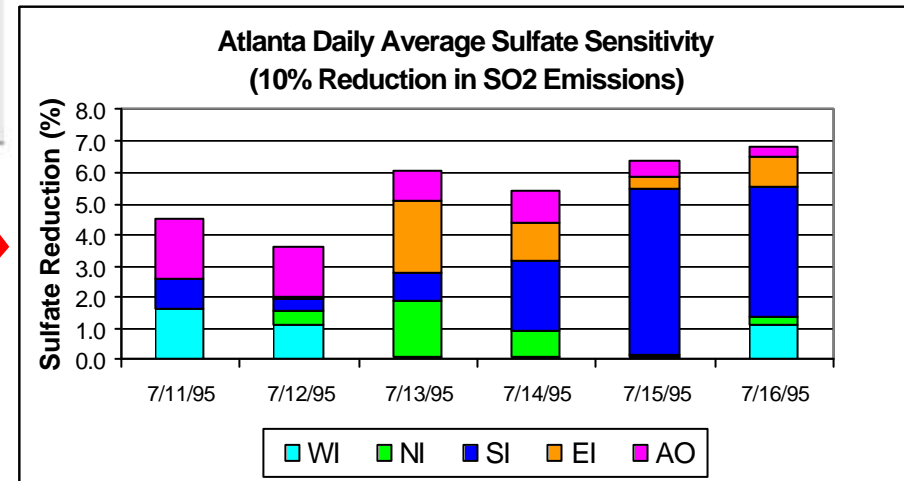
SO<sub>2</sub> Emissions Reduced by 30 Percent



# Source Attribution: Sulfate by Source Region



**Direct  
Sensitivity  
Analysis**



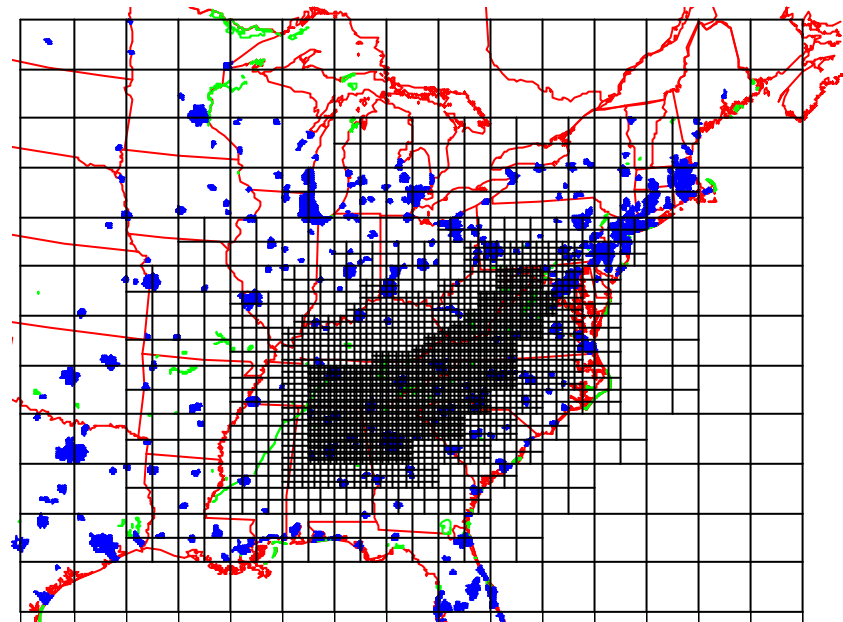
# Particulate Matter Modeling and Chemical Mechanisms

- Current generation of gas-phase mechanisms (e.g., SAPRC99+, RACM) in pretty good shape for ozone
  - Flexible
  - Evolutionary
  - Appear to adequately describe gas phase kinetics for ozone, etc
  - **Limited information for determining organic composition of PM**
    - Important information for identifying sources and impacts lost
- Aqueous phase mechanisms
  - Likely adequate for inorganics and ozone
  - Questions about organic oxidation

# PM Modeling State of the Science: Where are We?

- Ozone models are “mature”
- PM Models still evolving
- “One atmosphere” / “3rd generation” urban-to-regional models are at the forefront
  - Combined gas/aerosol/deposition & nested/multiscale
  - Some built in diagnostic features
    - Sensitivity analysis

## Regional Multiscale Model



# Attributes of Advanced Models: Internal Mixture Models

- Usual attributes of advanced internal mixture models
  - Advanced chemical mechanism
  - Sectional or modal approach
  - Thermodynamic inorganic
  - One-step organic formation
    - Two step on the way, but large uncertainties
  - Advanced diagnostic features
  - Examples: URM, CMAQ, CIT-AERO, UAM-AERO
    - URM extensively evaluated over eastern US as part of SAMI
    - CMAQ is to become the community model



# Attributes of Advanced Models: External Mixture Models

- Features
  - Limited applications to date
  - Very time and resource consuming
  - AIM thermodynamics/growth
  - Trajectory and grid-based versions of CIT model
    - See Cass, Kleeman and co-workers
  - Expect wider application in next 10 years

# Example Model Application: SAMI

- Southern Appalachians Mountains Initiative (SAMI)
  - Stakeholder process to develop regional strategy to deal with:
    - Ozone (Sum06), PM, haze, acid deposition
    - Single model applied to suite of 5, 10 day episodes
      - Episodes chosen to represent typical year

# SAMI Modeling

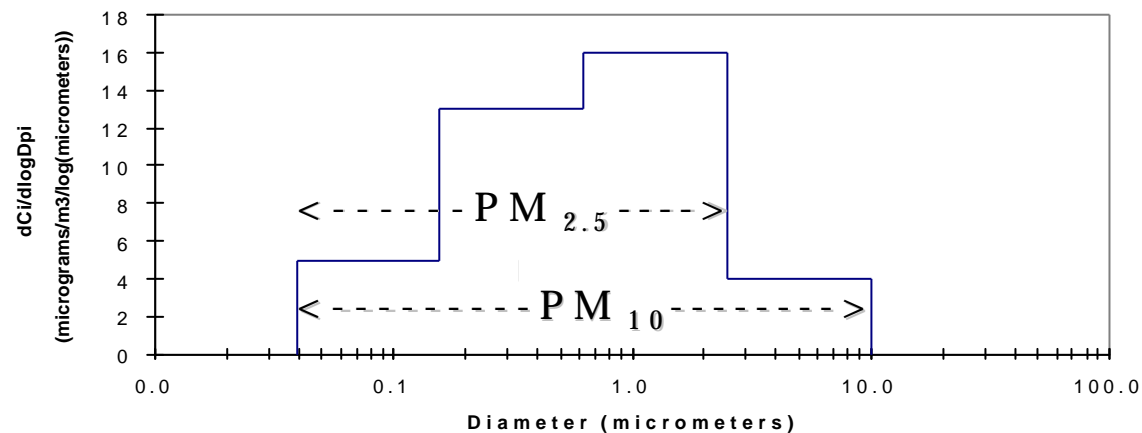
- Air Quality: **URM-1ATM** (Urban-to-Regional Multiscale One Atmosphere) Model
  - Horizontal cells of varying dimensions (12 - 192 km)
  - 7 vertical layers extending from surface to 12.8 km
- Meteorology: **RAMS** (Regional Atmospheric Modeling System)
  - temperature, air density, wind speed and direction, total solar radiation, ultraviolet radiation, mixing height, turbulent momentum diffusivity, precipitation, cloud parameters
- Emissions: **EMS-95** (Emission Modeling System)
  - Gas:  $\text{NO}_x$ , VOCs, CO,  $\text{NH}_3$ ,  $\text{SO}_2$
  - Aerosols: OC, EC, Ca, Mg, K,  $\text{NO}_3$ ,  $\text{SO}_4$ , “other” PM

# Urban-to-Regional Multiscale One Atmosphere (URM-1ATM) Model

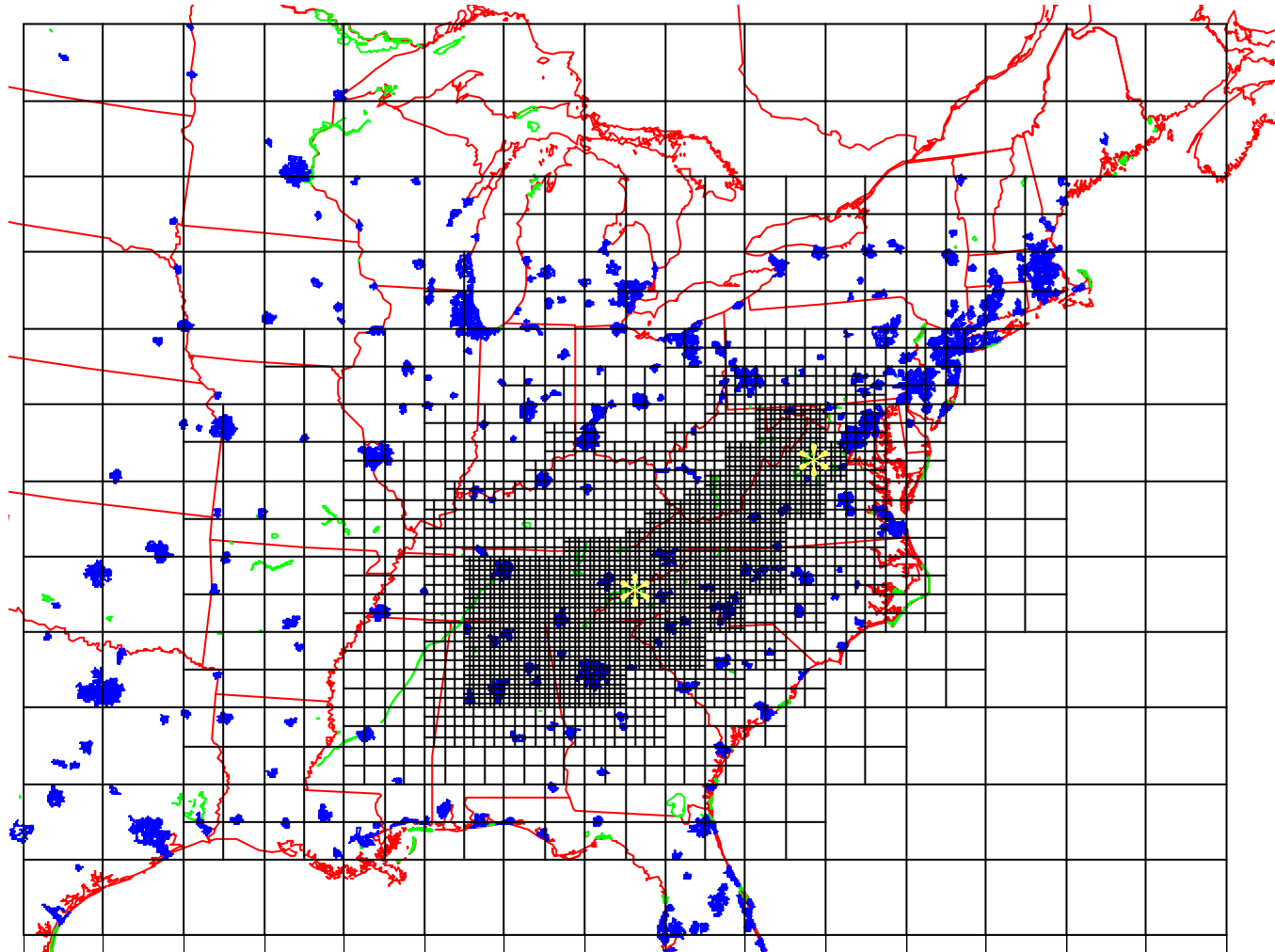
- Three-dimensional Eulerian photochemical model
  - Finite element, multiscale transport scheme (Odman & Russell, 1991)
  - Gas-phase chemistry
    - SAPRC-93 mechanism (Carter, 1994)
  - Aqueous-phase heterogeneous sulfate chemistry
  - Aerosol dynamics
    - Sectional approach (Gelbard and Seinfeld, 1980)
    - ISORROPIA thermodynamic equilibrium (Nenes, *et al.*, 1998)
    - Organic aerosol yields (Pandis, *et al.*, 1992)
  - Acid deposition
    - Wet: Reactive Scavenging Module (Berkowitz, *et al.*, 1989)
    - Dry: three-resistance approach
- “One atmosphere” modeling approach

# Aerosol Module

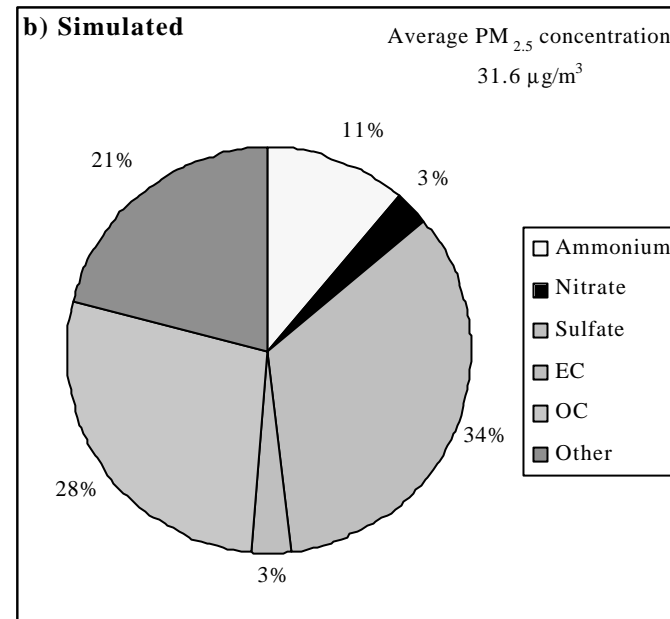
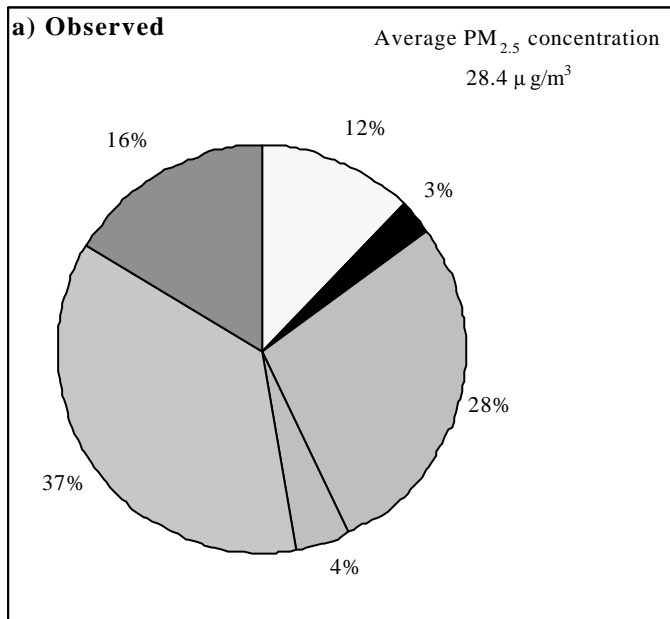
- Inorganic aerosols - ISORROPIA
  - sulfate, nitrate, ammonium, chloride, sodium, hydrogen ion
  - condensation/evaporation (thermodynamic equilibrium)
- Organic aerosols
  - experimental and estimated aerosol yields from VOC oxidation
- Inert Species
  - EC, Mg, Ca, K, other PM
- Sectional Size Distribution



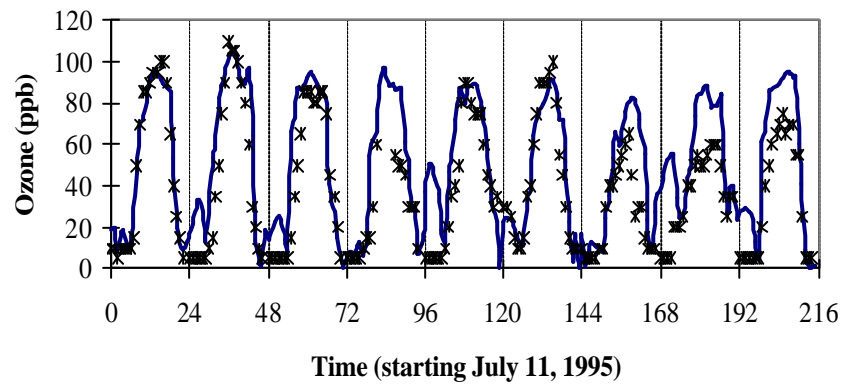
# SAMI Modeling Domain and Grid



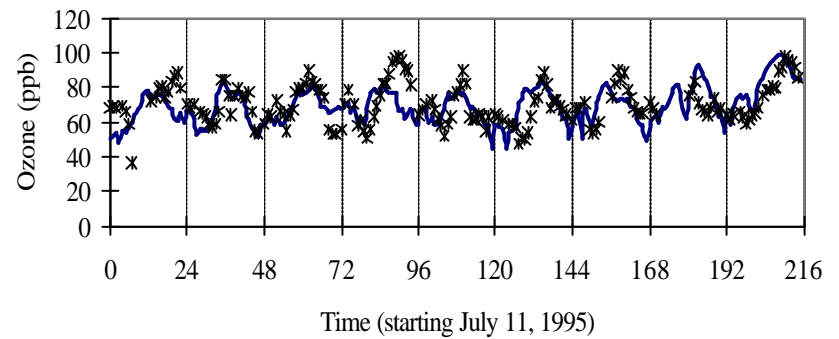
# Performance



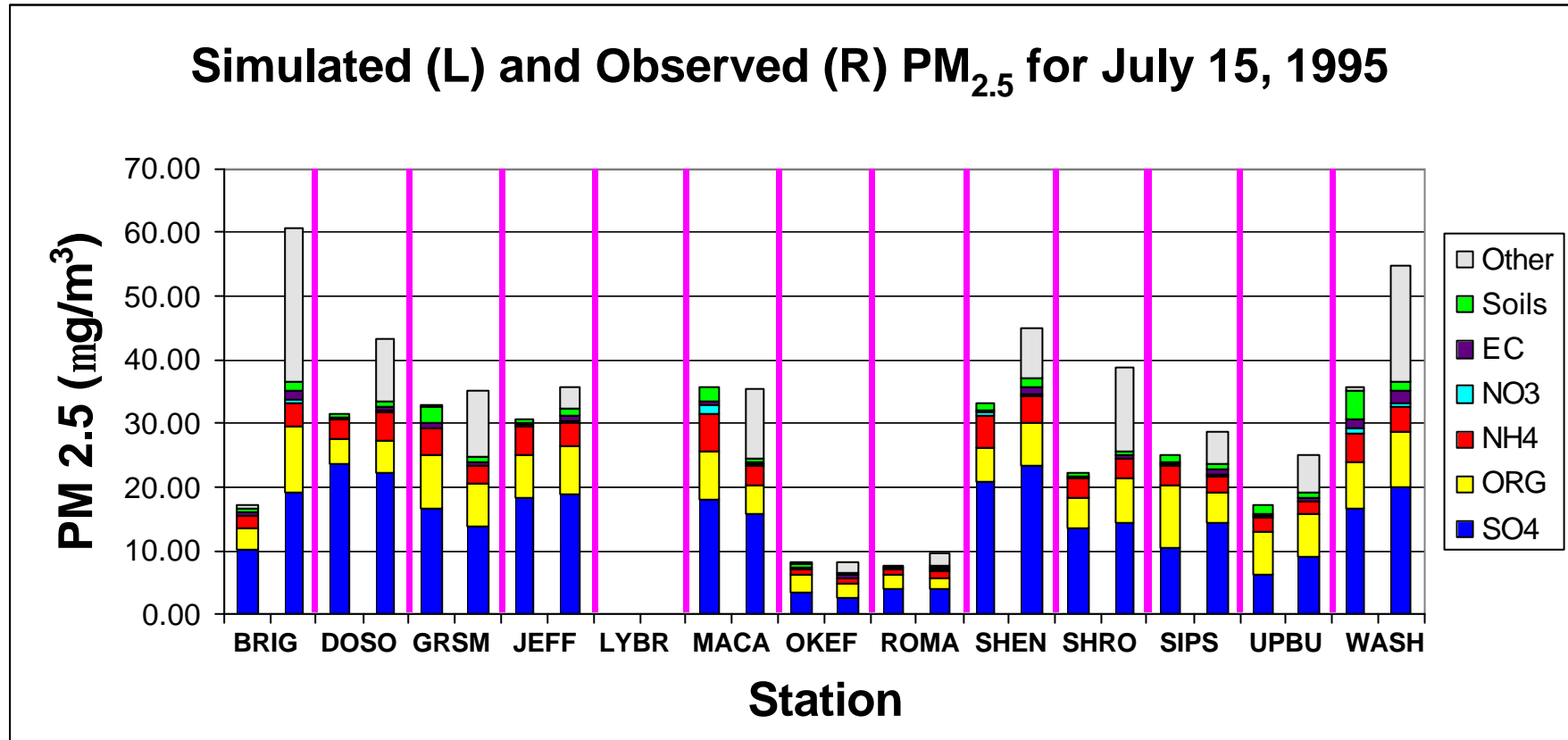
**AIRS Station 47-037-0011; Nashville, Davidson Co, TN (urban)**



**AIRS Station 47-099-0101; Look Rock, Blount Co, TN  
(high elevation)**



# Performance on July 15, 1995





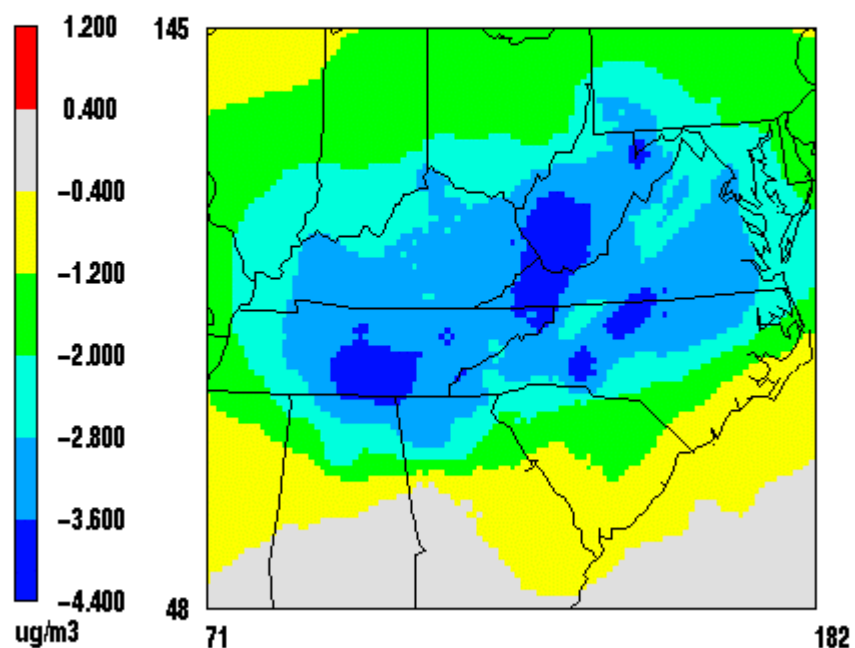
# Sensitivity Analysis to Emissions

- DDM - Decoupled Direct Method: Extended to Particulate Matter
  - Use direct derivatives of governing equations
  - Perform numerous sensitivity calculations in one model run.
  - Inaccurate sensitivities may result due to non-linear response
  - Assessed response of PM to emissions
    - Regionally
    - By source region

# Sulfate Sensitivity to SO<sub>2</sub> Emissions

## Sulfate Sensitivity

30% Reduction in SO<sub>2</sub> Emissions  
DDM

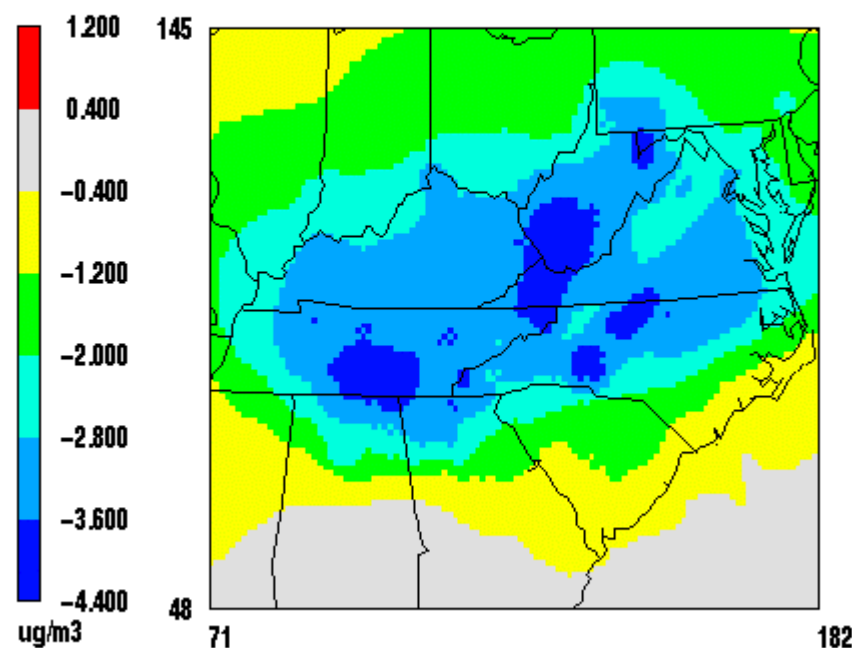


July 15, 1995 23:00:00  
Min= -4.726 at (138,110), Max= -0.101 at (111,67)

FAVE  
by  
MCNC

## Sulfate Sensitivity

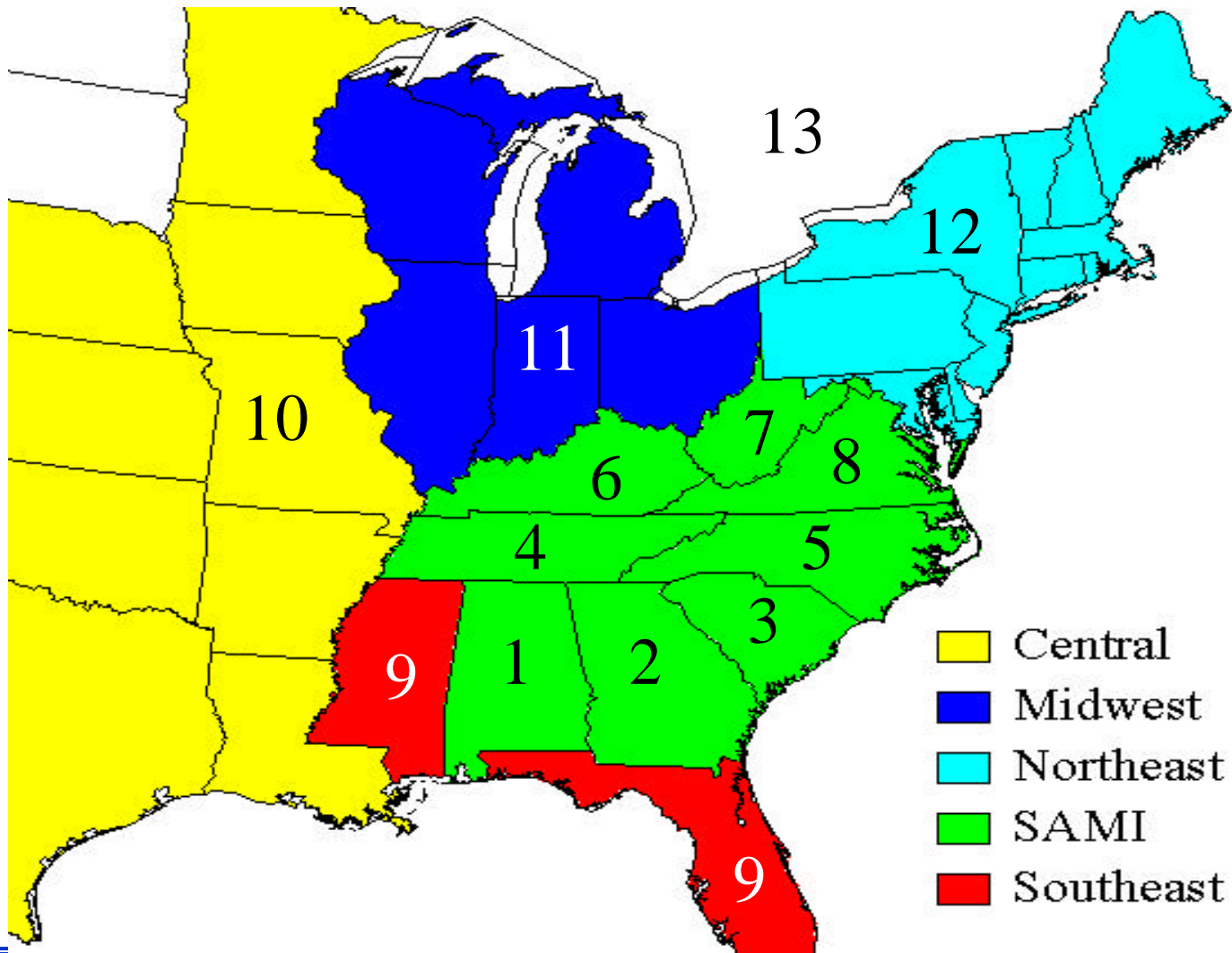
30% Reduction in SO<sub>2</sub> Emissions  
Brute Force



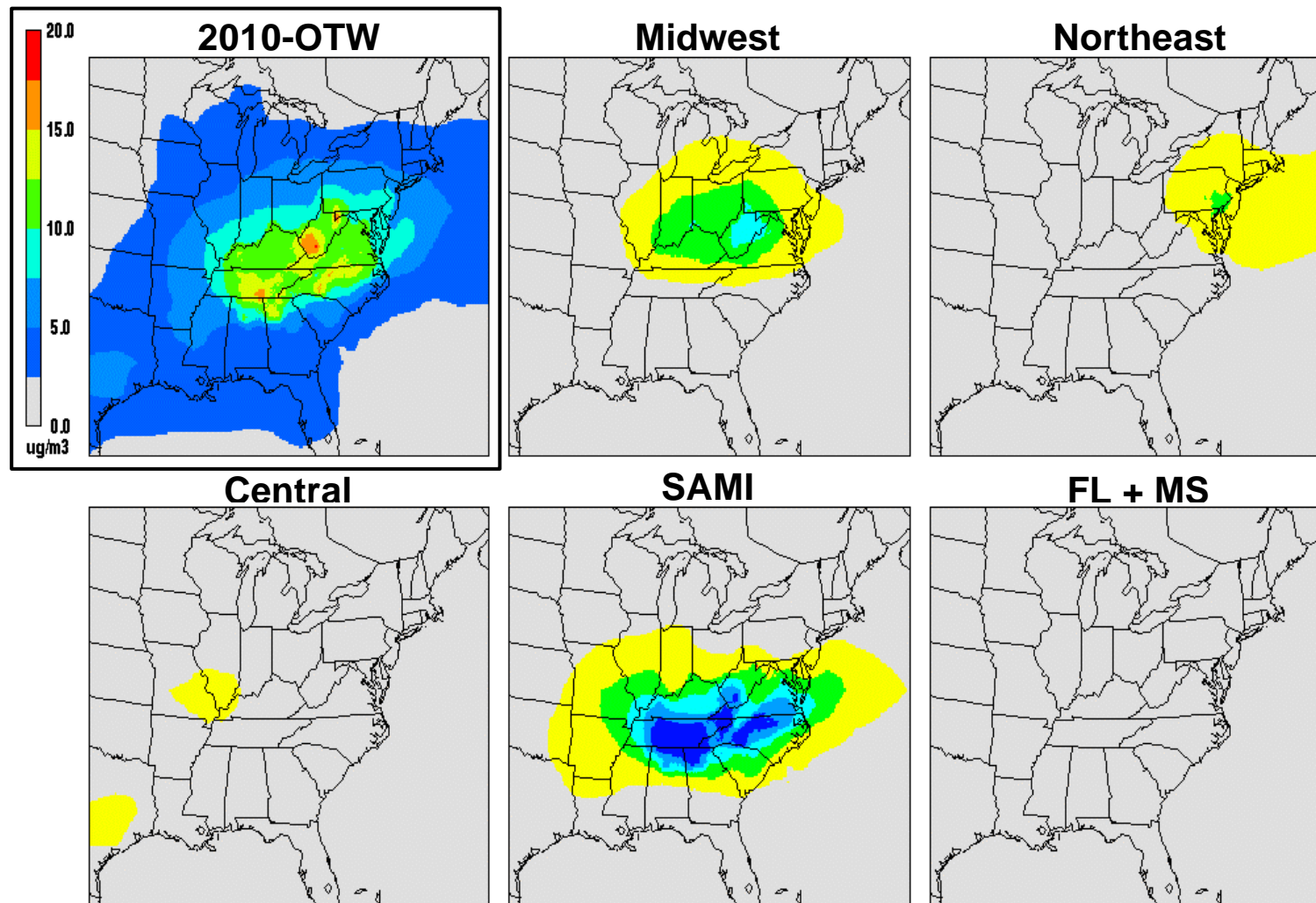
July 15, 1995 23:00:00  
Min= -4.736 at (138,110), Max= -0.093 at (105,49)

FAVE  
by  
MCNC

# Geographic Sensitivity Regions



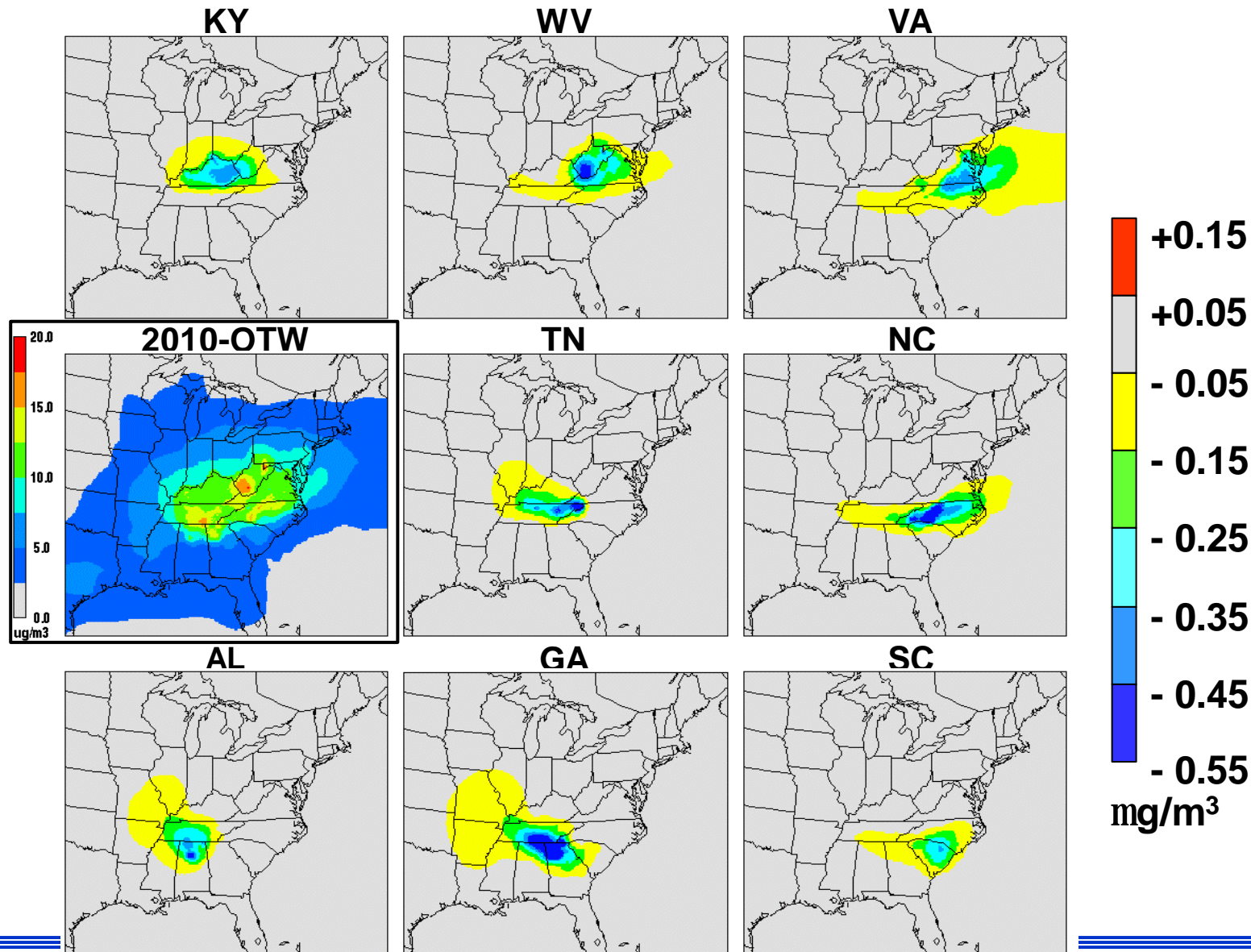
SO<sub>4</sub> & its Change on July 15, 1995 for a 10% Reduction of 2010-OTW SO<sub>2</sub> Emissions from Different Regions



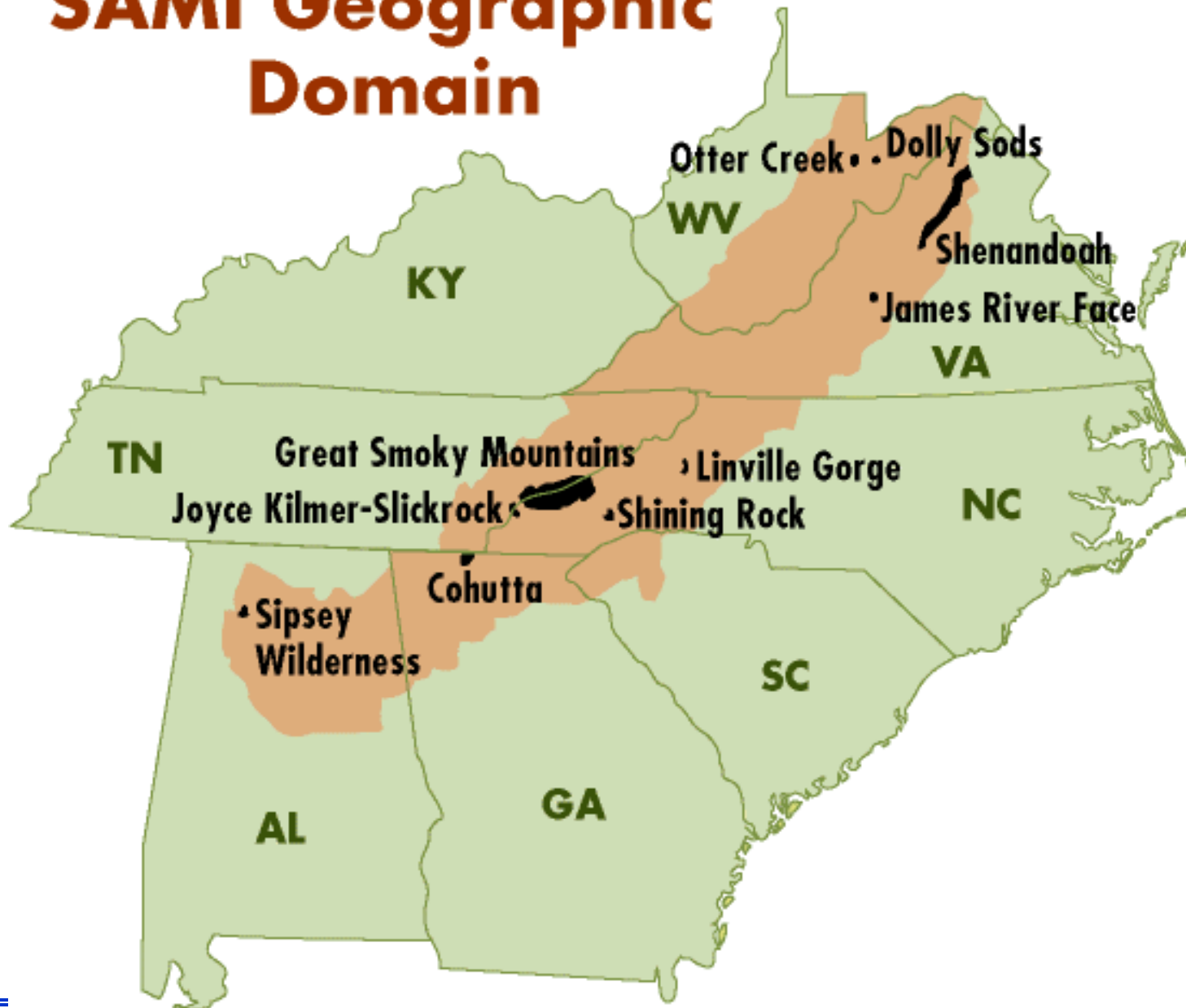
Georgia Institute of Technology

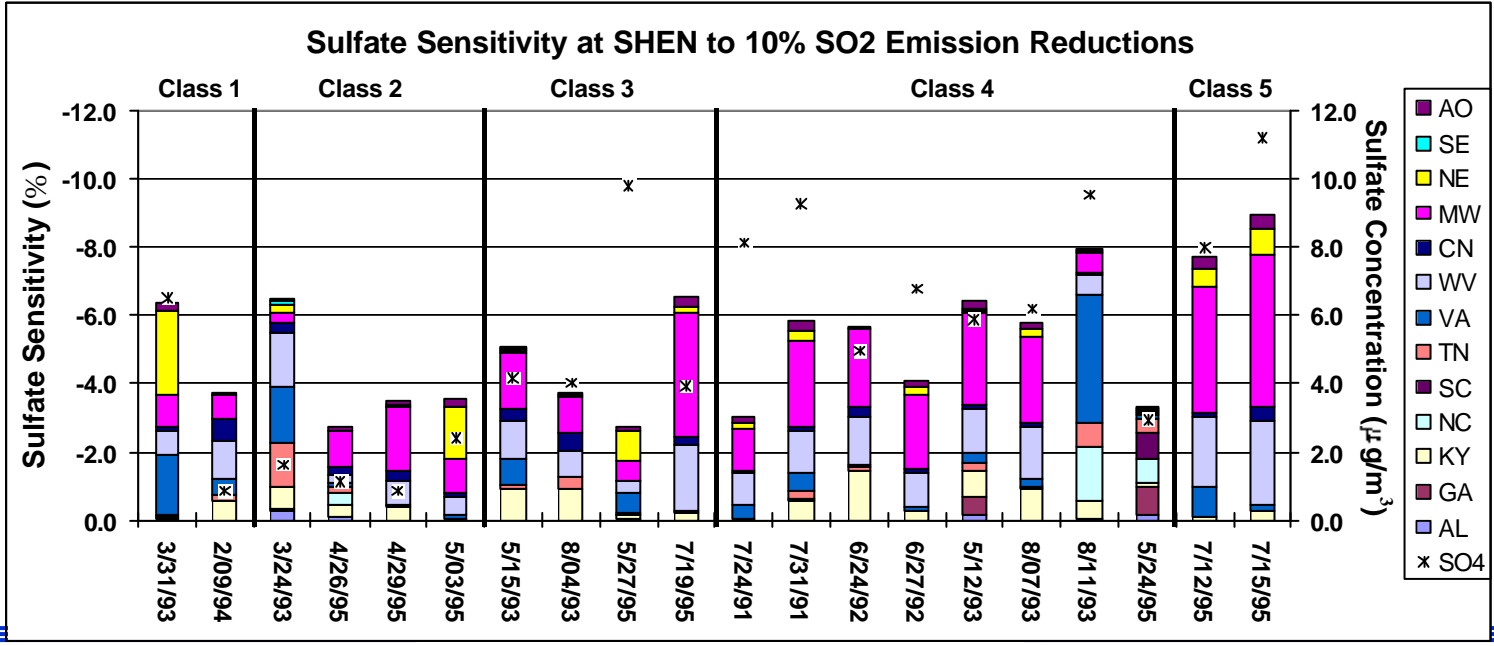
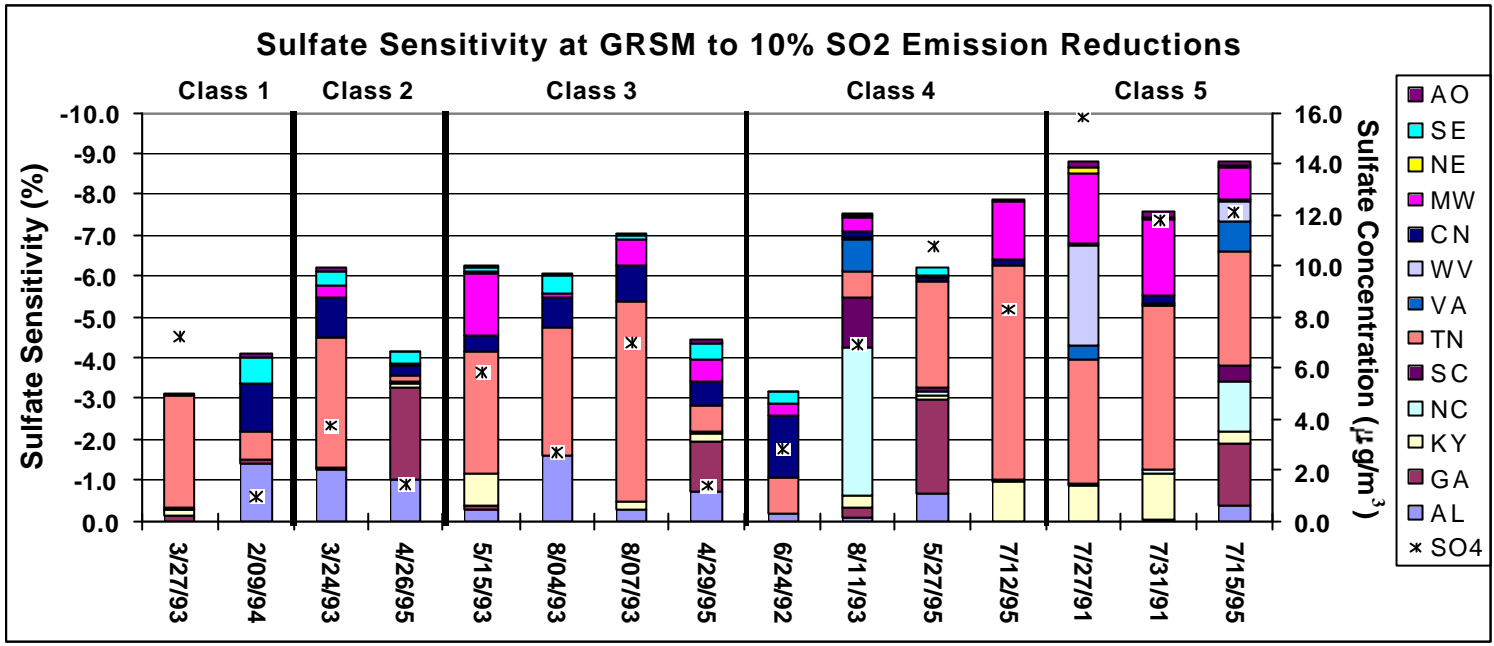
+0.3 +0.1 -0.1 -0.3 -0.5 -0.7 -0.9 -1.1 mg/m<sup>3</sup>

# SO<sub>4</sub> & its Change on July 15, 1995 for a 10% Reduction of 2010-OTW SO<sub>2</sub> Emissions from SAMI States



# SAMI Geographic Domain



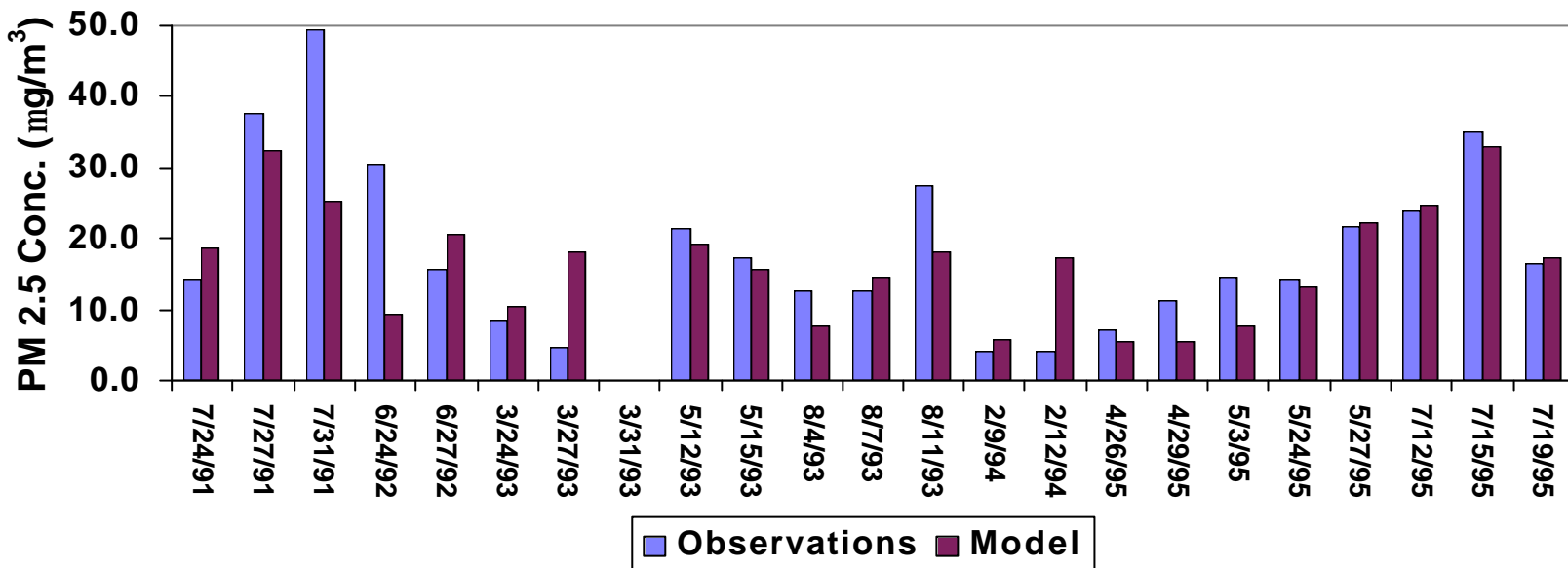


# Summary

- Ozone models are “mature”
- PM Modeling is developing
  - Much more involved
  - More uncertainties
  - Performance is acceptable
- Main Features
  - Internal mixtures
    - External computationally huge
  - Sectional distribution
    - More flexible than modal
  - Inorganic thermodynamics
- Useful features
  - Direct sensitivity analysis
- Future
  - External mixture approach more common
  - more detailed organic chemistry



### Great Smoky Mt. National Park



### Shenandoah National Park

