

# Challenges in Atmospheric Chemistry Modeling

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## Acknowledgements

- Claire Granier, CNRS and CIRES.
- Louisa Emmons, NCAR
- Douglas Kinnison, NCAR
- Martin Schultz, MPI-M
- Olaf Stein, MPI-M

## Part 1. Introduction

### Chemical Transport Models

- Chemical Transport Models
- The goal of CTMs is to calculate the spatial distribution and temporal evolution of chemically interactive species.
- Models are often used to diagnose observations, test hypotheses, calculate global and regional chemical budgets, and simulate the past and future evolution of the chemical composition for prescribed conditions (evolving boundary conditions).
- The calculation of atmospheric transport requires that dynamical parameters be specified.
- Chemical transport models are often coupled 'on-line' to general circulation models.

## Part 2. Fundamental Equations

### Fundamental Equations Governing the Atmosphere Evolution

$$\frac{\partial \vec{v}}{\partial t} = -\vec{v} \cdot \nabla \vec{v} - \frac{1}{\rho_a} \nabla p - g \vec{k} - 2\vec{\Omega} \times \vec{v} + \vec{F}_{visc} \quad (1), \text{ equation of motion}$$

(3 components)

$$\frac{\partial \rho_a}{\partial t} = -\nabla \cdot \rho_a \vec{v} \quad (2), \text{ air mass conservation}$$

$$\frac{\partial \theta}{\partial t} = -\vec{v} \cdot \nabla \theta + Q_\theta \quad (3), \text{ first law of thermodynamics}$$

$$\frac{\partial r_n}{\partial t} = -\vec{v} \cdot \nabla r_n + Q_{r_n} \quad (4), \text{ water mass mixing ratio conservation}$$

$$\frac{\partial s_{[v]}}{\partial t} = -\vec{v} \cdot \nabla s_{[v]} + Q_{s_{[v]}} \quad (5), \text{ gases/aerosols mass mixing ratio conservation}$$

Q represents the loss/production rate

## Continuity Equation for Chemical Species

Mathematically describes the dynamical and chemical processes that determine the distribution of chemical species

flux form :  $\frac{\partial \rho_i}{\partial t} + \nabla \cdot (\rho_i \mathbf{v}) = S_i$

advection form :

$$\frac{\partial f_i}{\partial t} + \mathbf{v} \cdot \nabla f_i = \frac{S_i}{\rho_a} \quad \text{or} \quad df_i/dt = S_i/\rho_a \quad (f_i \text{ is a conserved quantity along the motion})$$

where,

$\rho_i$  is the mass (or number) density of species  $i$

$\rho_a$  is the air mass (or number) density

$f_i = \frac{\rho_i}{\rho_a}$  is the mass (or volume) mixing ratio

$S_i$  is the production and loss rate of species  $i$

$\mathbf{v}$  is the wind velocity vector

## Chemical Composition of the Atmosphere

Concentration  $\rho_i$  of atmospheric trace gas  $i$ : ( $i=1, N$ )

Change in concentration is determined by

- Emissions
- Deposition
- Transport at various scales  
[resolved by the spatial resolution of the model and subscale (parameterisation)]
- Chemical and photochemical reactions



$$\frac{d\rho_i}{dt} = \left( \frac{\partial \rho_i}{\partial t} \right)_{emission} + \left( \frac{\partial \rho_i}{\partial t} \right)_{deposition} + \left( \frac{\partial \rho_i}{\partial t} \right)_{transport} + \left( \frac{\partial \rho_i}{\partial t} \right)_{chemistry}$$

## On-line (coupled) versus off-line models

- In “off-line” models, transport is driven using outputs provided at regular intervals (e.g., 3 hours) by an atmospheric general circulation model or by atmospheric analyses (data assimilation).
- In “on-line” models, the solution for chemical species is obtained simultaneously with the solutions of the dynamic equations. This has some considerable benefits:
  - a) Uses the same spatial and temporal resolution (e.g., 20 min)
  - b) Uses exactly the same coordinate system
  - c) Accounts for feedbacks between dynamics and chemistry.
  - d) More easy treatment of the model output (real time weather and air quality forecasts).
  - e) But... can be computationally expensive.

## Part 3. Numerical Solutions

### Solving the Continuity Equations for N Chemical Species

- $N$  species leads to  $N$  coupled non-linear equations which rarely have an analytic solution.
- System is solved with numerical methods at discrete locations ("grid-points").
- Differentials replaced by finite differences.
- Finite resolution (time or space) implies that some transport processes are unresolved (e.g. diffusion).
- Chemistry and transport handled as separate operations.

## Part 3. Numerical Solutions

- 1. Transport

### Advection

- Desired properties of an advection scheme:

- Accuracy
- Stability
- Mass conservation
- Monotonicity (shape preservation)
- Positive definite fields
- Local
- Efficient

Three groups of algorithms:

- Eulerian
- Lagrangian
- Semi-Lagrangian

### Advection

- **Eulerian Methods:**

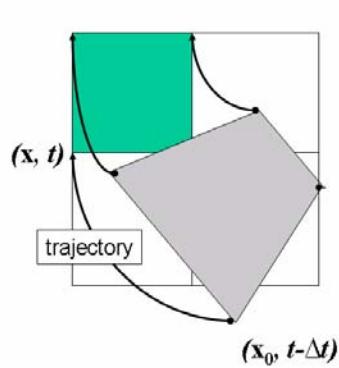
- The Euler forward (explicit) scheme is unconditionally unstable
- The Upwind method is diffusive
- The Leapfrog method is not monotonic
- Improved methods: Smolarkiewicz, Bott, Prather (transport of moments).
- The CFL condition must be verified to ensure stability.

$$\frac{|c|\Delta t}{\Delta x} \leq \text{Const, with Const} \approx 1$$

• **Lagrangian methods:** Simple concept, but air parcels can 'bunch up' in certain areas during the integration. (no mixing)

• **Semi-Lagrangian methods:** Not limited by timestep, but not mass conserving, unless adapted (e.g., Lin and Rood)

## Semi-Lagrangian Transport



$$\mathbf{x}_0 = \mathbf{x} + \int_t^{t-\Delta t} \mathbf{v}(\mathbf{x}, t) dt$$

Calculation of back trajectory requires iterations (since wind speed  $v$  is not known everywhere along the trajectory)

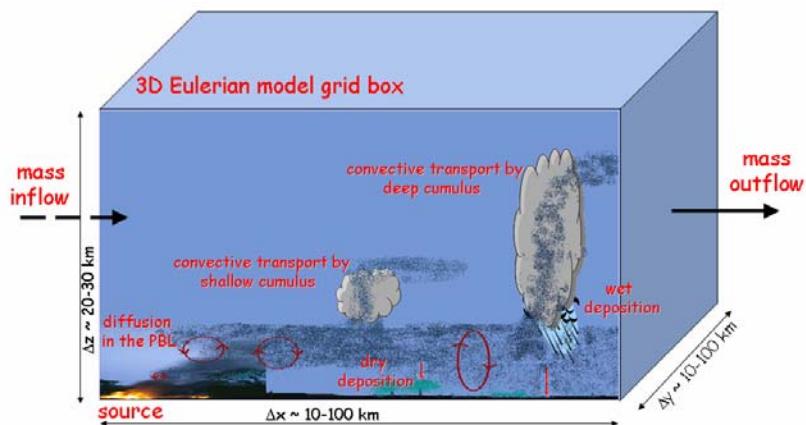
Accuracy depends greatly on Interpolation scheme used to determine the mixing ratio at departure point.

Common in modern GCMs, but not mass conservative.....

## Conservative Semi-Lagrangian Methods

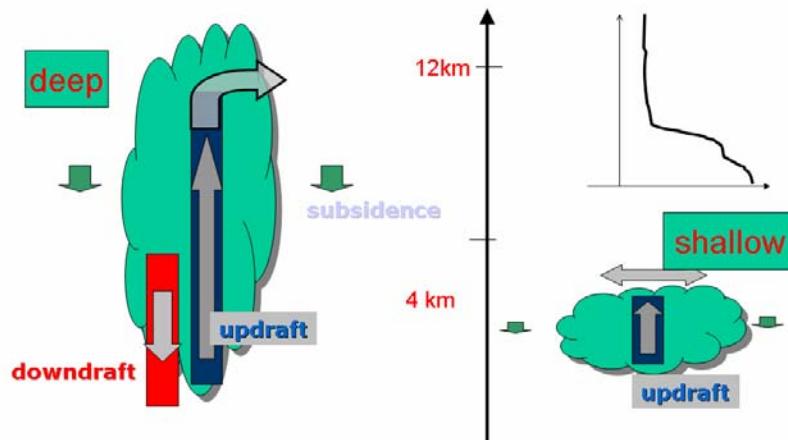
- Rather than considering variables at specific grid points, one can transport *integral* quantities or *average* values over finite cell volumes.
- In finite-volume-based Semi-Lagrangian methods, the value of the advected field at a new time level is just the average value of the departure cell defined by its upstream position at the previous timestep.
- Lin and Rood (1996) have developed a mass conservative finite volume semi-Lagrangian method, in which the boundaries ("departure walls" rather than "departure points") of the grid volumes are transported to the next step ("arrival walls"). Mass is conserved in the box during a timestep. The CFL restriction does not apply.

### Some sub-grid Process involved in Gases/Aerosols Transport

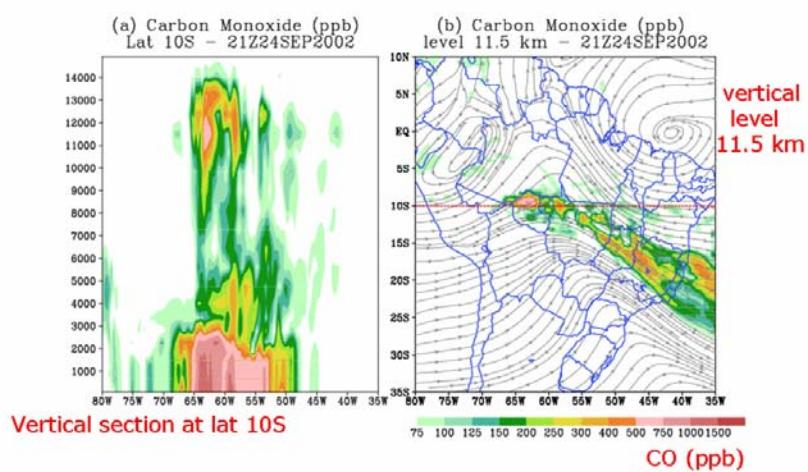


## Sub-grid Convective Transport

Cloud venting is a very important mechanism transporting pollutants from the PBL to the upper levels, affecting the chemistry of troposphere and the biogeochemical cycles.



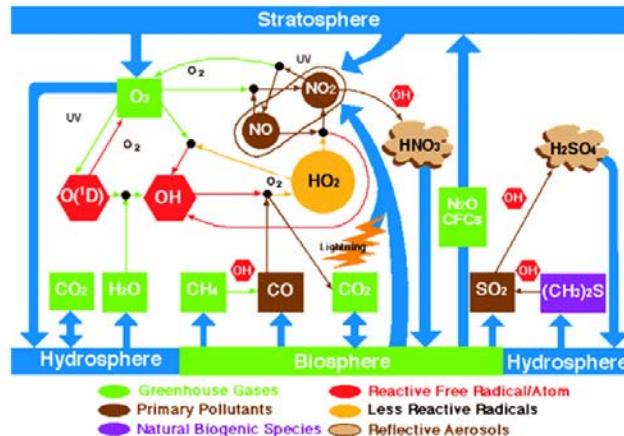
## Deep Convective Transport of CO 21Z 24 Sep 2002



## Part 3. Numerical Solutions

- 1. Transport
- 2. Chemistry

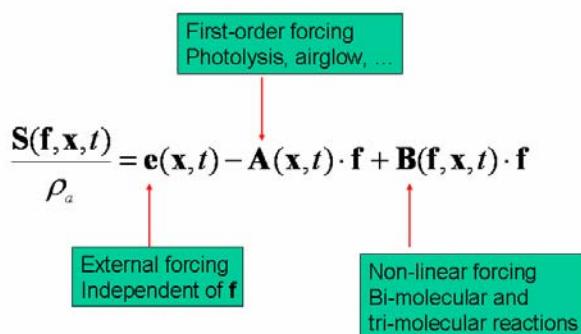
### Tropospheric Chemistry



### Chemistry: Solving $df/dt = S/\rho$

- This is a system of N equations (N being the number of chemical species in the model – typically 50 to 150).
- The system is non-linear and ‘stiff’ (time constants of species varying from microseconds to centuries).
- The numerical method must be stable and accurate for a timestep that is sufficiently large for the system to be efficiently integrated.

### Chemical forcing (S) (i.e. production and loss)



For N species, A and B are NxN matrices

## Chemistry: Solving $df/dt = S/\rho$

Simplest method is fully explicit :

$$\mathbf{f}^{n+1} = \mathbf{f}^n + \Delta t \cdot \mathbf{S}(t_n, \mathbf{f}^n) / \rho_a \quad \text{Euler Forward}$$

$\mathbf{f}^{n+1}$  expressed in terms of known quantities

Requires very small time - steps.

Fully implicit is stable for any  $\Delta t$ :

$$\mathbf{f}^{n+1} = \mathbf{f}^n + \Delta t \cdot \mathbf{S}(t_{n+1}, \mathbf{f}^{n+1}) / \rho_a \quad \text{Euler backward}$$

However,  $\mathbf{S}$  contains non - linear terms, and

accuracy is compromised for large  $\Delta t$ .

Iterative techniques are often used to  
improve the accuracy of implicit methods.

Prominent is the Newton-Raphson iteration which requires that  
the Jacobian matrix of the chemical system be calculated.  
The convergence is achieved for sufficiently small timesteps

## Chemistry: Solving $df/dt = S/\rho$

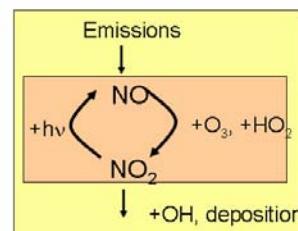
- A multi-step method very appropriate for "stiff" systems has been developed by Gear (1971).
- This algorithm is composed of the so-called backward difference formulas up to order six.
- The method is extremely robust and stable but does require solving nonlinear algebraic systems (like Euler backward algorithm).
- Time step and order of the method are continuously adapted to meet user-specified solution error tolerances.
- Codes require much computer memory and time; not practical for multi-dimensional models.

## Chemistry: Solving $df/dt = S/\rho$ : Chemical Families

Species are grouped together within specified chemical families Because of the longer lifetime associated with the families, relatively large timestep can be used to integrate the equations

Partitioning between members of the family are made by assuming equilibrium conditions for fast reactive species within the family.

Example:  $\text{NO}_x = \text{NO} + \text{NO}_2$



$$\frac{d\text{NO}}{dt} = \text{Emissions} + j_{\text{NO}_2} \cdot \text{NO}_2 - \text{NO}(k_1 \cdot \text{O}_3 + k_2 \cdot \text{HO}_3)$$

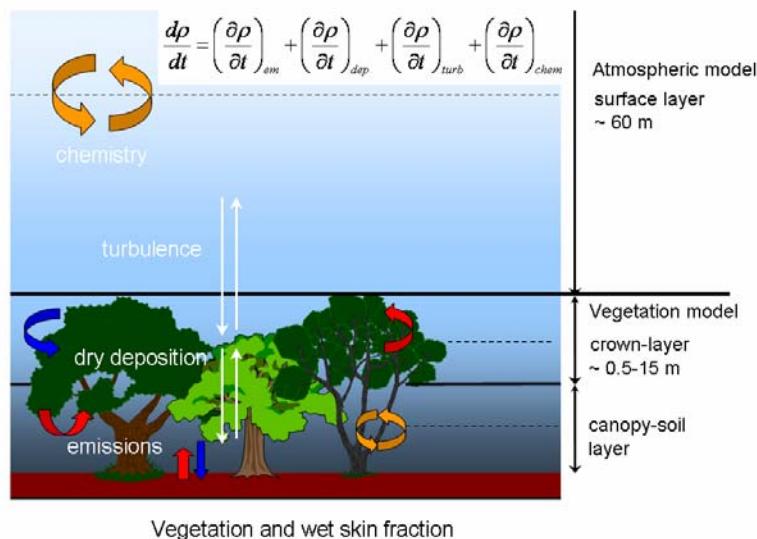
$$\frac{d\text{NO}_2}{dt} = \text{NO} \cdot (k_1 \cdot \text{O}_3 + k_2 \cdot \text{HO}_3) - j_{\text{NO}_2} \cdot \text{NO}_2 - k_3 \cdot \text{NO}_2 \cdot \text{OH} - \text{deposition}$$

$$\frac{d\text{NO}_x}{dt} = \frac{d\text{NO}}{dt} + \frac{d\text{NO}_2}{dt} = \text{Emissions} - k_3 \cdot \text{NO}_2 \cdot \text{OH} - \text{deposition}$$

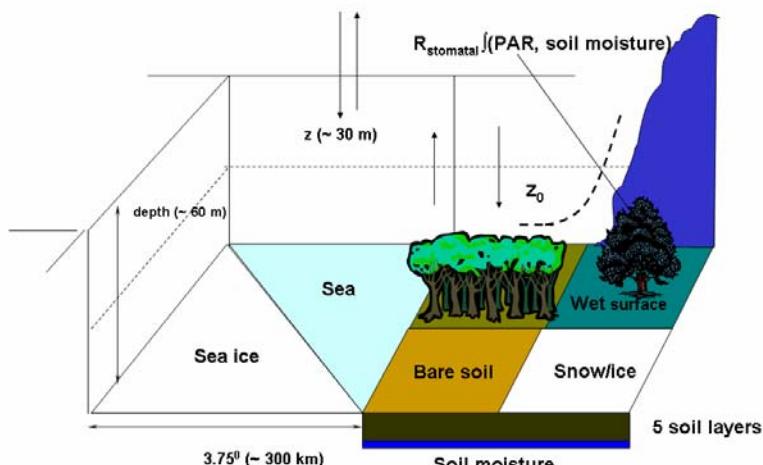
## Part 3. Numerical Solutions

- 3. Surface Processes

### Surface exchanges: emission-deposition



### Model surface description

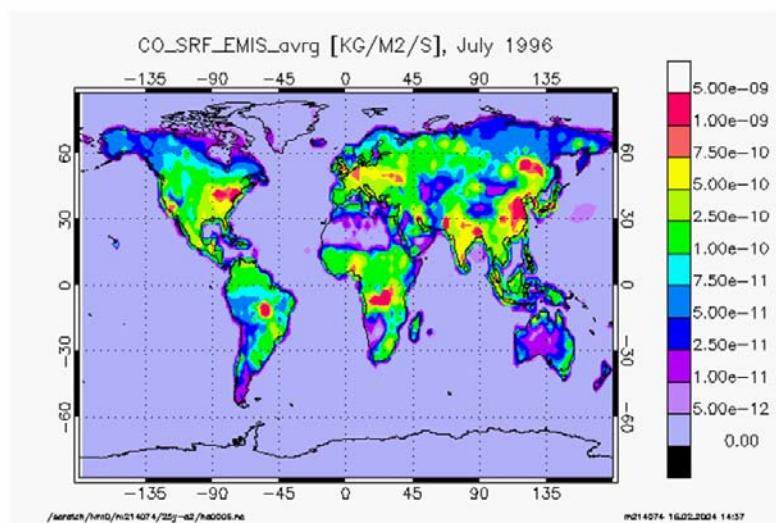


### Emissions

Typical categories of „bottom-up“ emissions inventories include:

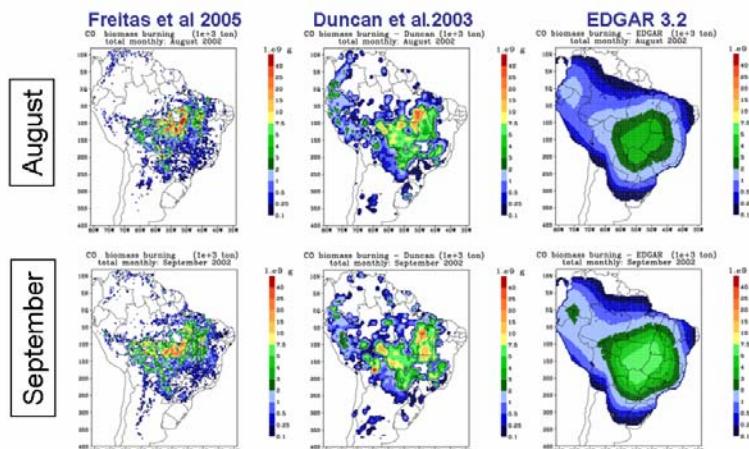
- fossil fuel combustion
- biofuel combustion
- vegetation fires
- biogenic emissions (plants and soils)
- volcanic emissions
- oceanic emissions
- agricultural emissions (incl. fertilisation)
- etc.

### Emissions of Carbon Monoxide

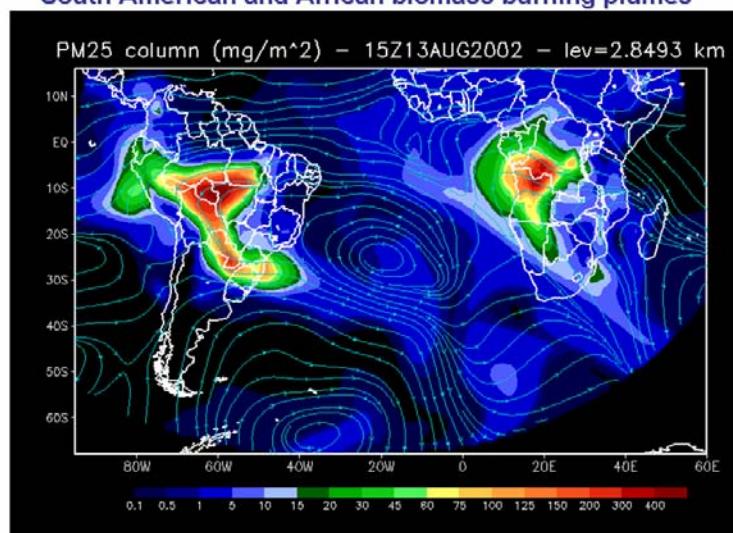


### Monthly Carbon Monoxide Emission Estimation for 2002

Hybrid remote sensing fire products: GOES WF\_ABBA AVHRR and GOES (INPE) MODIS (NASA) From INPE/CPTEC, Brazil



### Model output for PM2.5 column – Aug 2002 (INPE, Brazil) South American and African biomass burning plumes



## Dry Deposition

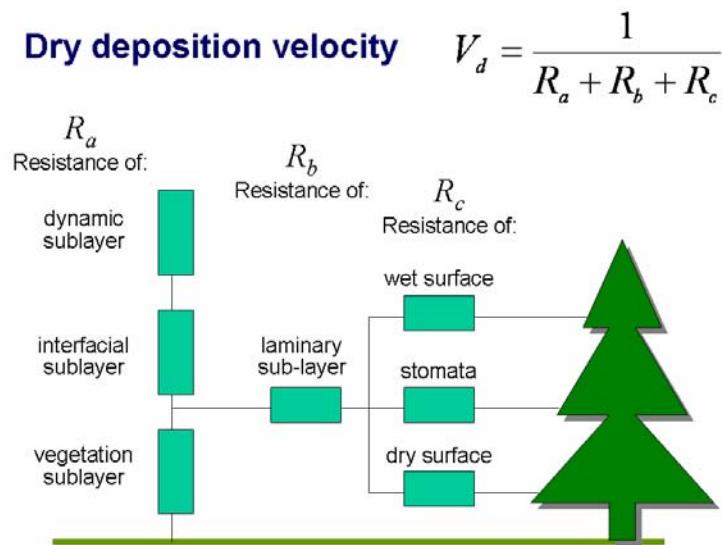
Transport of gaseous and particulate species from the atmosphere onto surfaces in the absence of precipitation

**Controlling factors:** atmospheric turbulence, chemical properties of species, and nature of the surface

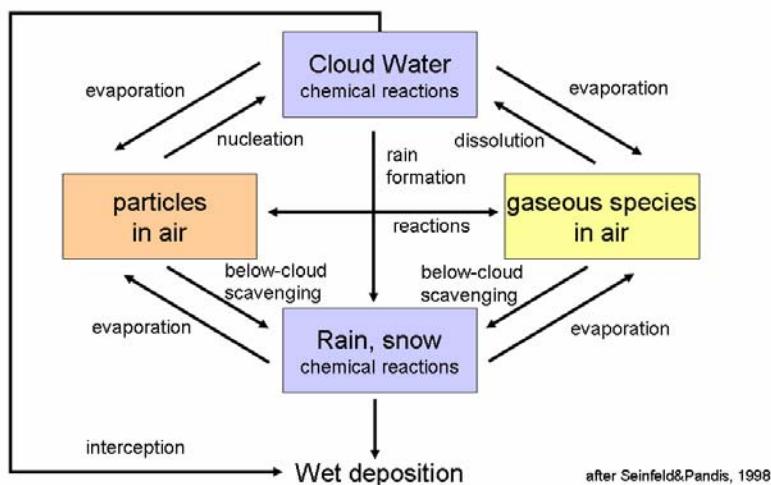
$$\text{Deposition flux: } F = -v_d C$$

$v_d$ : deposition velocity

$C$ : concentration of species at reference height (~10 m)



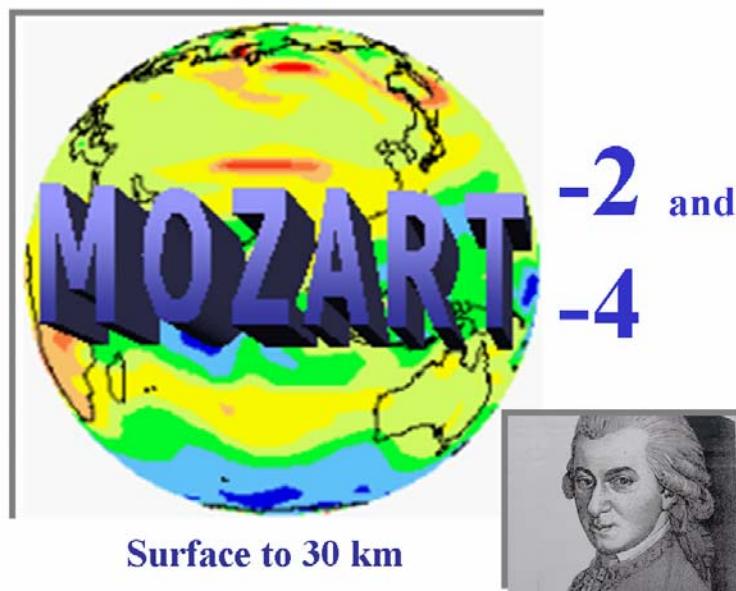
## Wet deposition



## Part 4: Illustrations

- Global Tropospheric Chemistry  
(MOZART-2 and -4)

- Stratospheric Chemistry  
(MOZART-3)



### MOZART-2: Model set-up



- Uses analysed winds (e.g. ECMWF, NCEP) or GCM output ( $T$ ,  $q$ ,  $u$ ,  $v$ ,  $p_s$ , ...)
- Standard chemistry scheme comprises of 65 species and 170 reactions. Chemistry is easily adaptable by means of a preprocessor code
- Runs efficiently on almost any computer platform (parallel and vectorized)
- Flexible output specification; postprocessing tools available

Brasseur *et al.*, JGR, 1998; Horowitz *et al.*, JGR, 2004.

## Parameterisations



- Model physics and hydrological cycle based on CCM model (Rasch et al., 1997)
- Boundary layer: Holtslag and Boville, 1993
- Advection: Lin and Rood, 1996
- Convection: Zhang and McFarlane, 1995; Hack, 1994
- Dry deposition: Wesely, 1989, Hess et al., 2000
- Scavenging: Giorgi ad Chameides, 1985; Brasseur et al., 1998
- Lightning NO<sub>x</sub> production: Price, Penner, and Prather, 1997

## MOZART-4: New Features



- Extended chemical mechanism (hydrocarbons)
- Interactive biogenic emissions and updated anthropogenic and fire emissions.
- New upper boundary conditions in the stratosphere
- SYNOZ (tracer with a specified source region (30S-30N, 10-70 hPa) and rate (400-500 Tg/yr); relaxed to 25 ppbv below 500 hPa)
- Improved radiative parameterisation for photolysis
- Aerosols coupled with gas phase chemistry
- Dry deposition interactive
- Improved albedo

## Chemical Mechanism (MZ-4)

- 97 compounds (with aerosols and no OX group)
- New hydrocarbons (instead of C<sub>4</sub>H<sub>10</sub>)
- Terpene oxidation mechanism updated with new lab data
- Minor corrections and rates updated to JPL 2002
- Photolysis rates updated to TUV
- OX - as group, or O<sub>3</sub>, O(<sup>1</sup>D), O each transported
- Aerosols: as in Tie et al. [2005], with updates
- Heterogeneous rxns: HO<sub>2</sub>, NO<sub>2</sub> [NO<sub>3</sub>, N<sub>2</sub>O<sub>5</sub> in MZ2]
- Dust: offline monthly means [from N. Mahowald]
- SYNOZ available (constrains the cross tropopause flux)

## Emissions

### MOZART-2

Based on EDGAR-2, Hao and Liu biomass burning climatology

### MOZART-4

POET (EDGAR-3), biomass burning based on satellite fire counts

### Ocean Emissions

**MZ-2:** CO, C2H6, C3H8, C2H4, C3H6, C4H10, CH3OH, Acetone

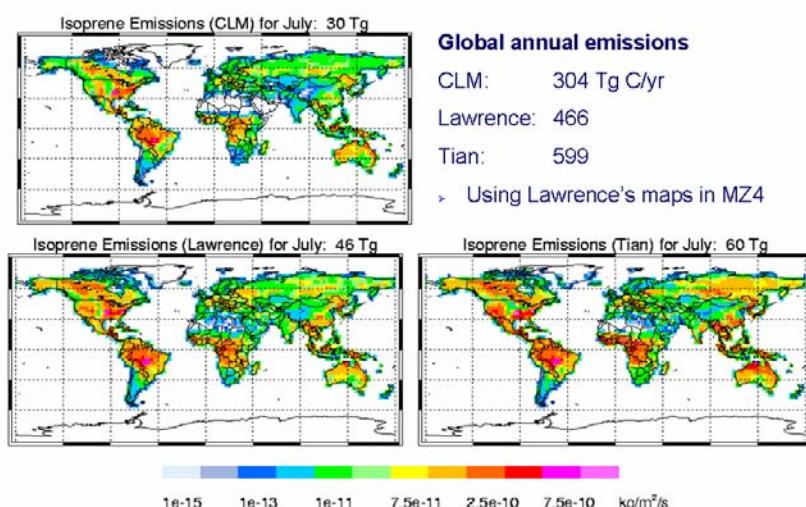
**MZ-4:** CO

Species	MOZART-2	MOZART-4
NO (TgN/yr)	40.8	45.3
CO (Tg/yr)	1194.7	1357.0
C2H6 (Tg C/yr)	9.6	9.3
C3H8 (Tg C/yr)	8.3	8.5
C2H4 (Tg C/yr)	19.2	14.3
C3H6 (Tg C/yr)	8.5	4.6
C4H10 (Tg C/yr)	29.9	—
BIGALK (Tg C/yr)	—	67.8
BIGENE (Tg C/yr)	—	7.0
TOLUENE (Tg C/yr)	—	30.7
ISOP (Tg C/yr)	410.5	452.1
C10H16 (Tg C/yr)	129.1	65.7
CH2O (Tg C/yr)	2.8	1.7
CH3COCH3 (Tg C/yr)	23.0	17.9
CH3OH (Tg C/yr)	116.9	89.9
C2H5OH (Tg C/yr)	—	5.3
CH3CHO (Tg C/yr)	—	5.4
MEK (Tg C/yr)	—	3.1

## On line Emissions – Isoprene and Terpenes

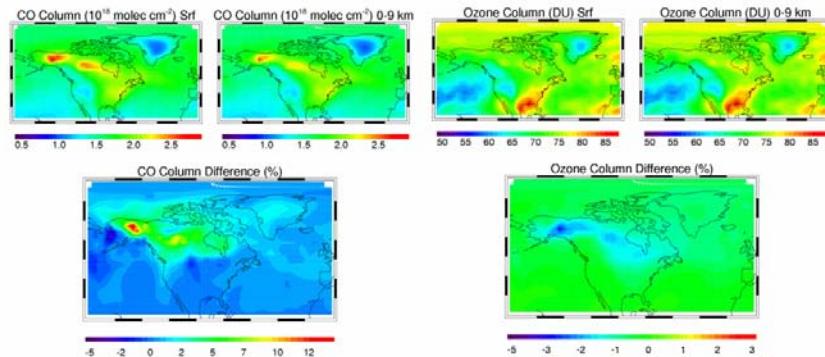
- Online Calculation of isoprene (*and monoterpane*) emissions based on MEGAN (Alex Guenther and others)
- Input
  - Temperature, Radiation, ...
  - Global distribution of emission factors
  - Global maps of Leaf Area Index (LAI)
  - Global maps of Plant Functional Type (PFT)
- LAI and PFT from CLM (Community Land Model) - AVHRR
- LAI and PFT from Yuhong Tian (2004) - MODIS
- LAI and PFT from Peter Lawrence (CU) - MODIS

## Effect of Vegetation Maps

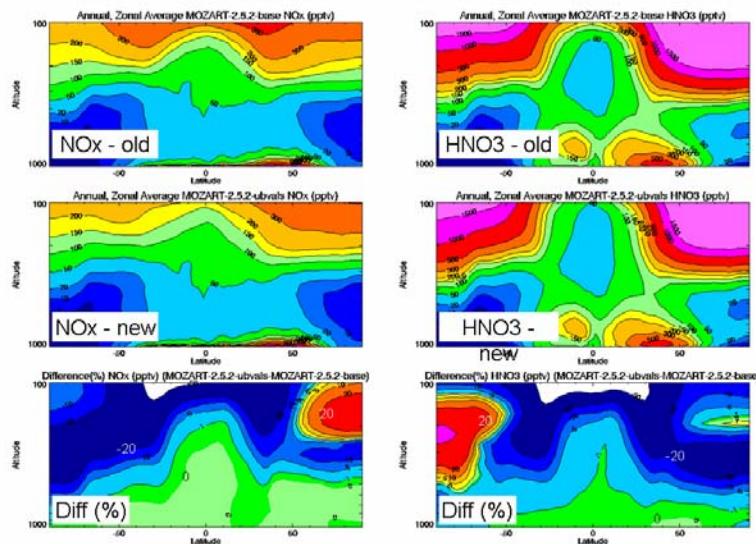


## Vertically distributed emissions

Averages of July and August, 2004 - emissions only  
at surface vs. distributed over 0-9 km



## Impact of Upper Boundary Conditions



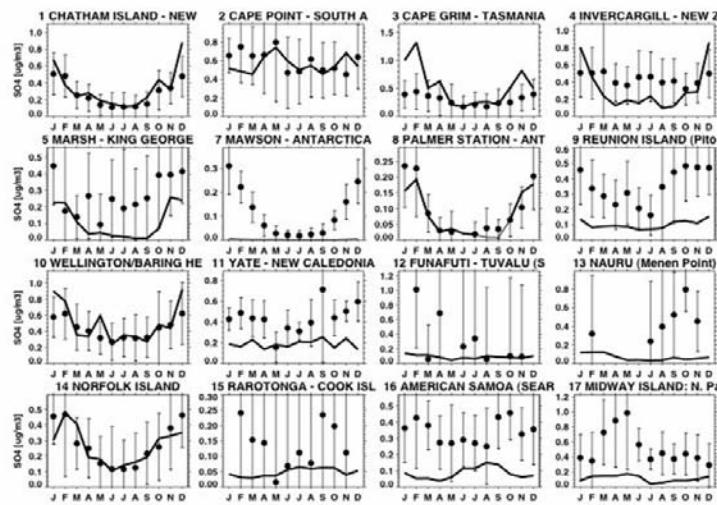
## SYNOZ

- Since the use of analyzed winds (e.g., NCEP) in MOZART usually results in too large stratospheric flux of ozone, SYNOZ is used
- SYNOZ is a tracer with a specified source region (30S-30N, 10-70 hPa) and rate (400-500 Tg/yr); relaxed to 25 ppbv below 500 hPa
- Ozone is set to SYNOZ above the tropopause, if SYNOZ > 100 ppbv
- O3RAD is set to the stratospheric ozone climatology and used for photolysis
- Requires 3-5 years spin-up for IC (provided)

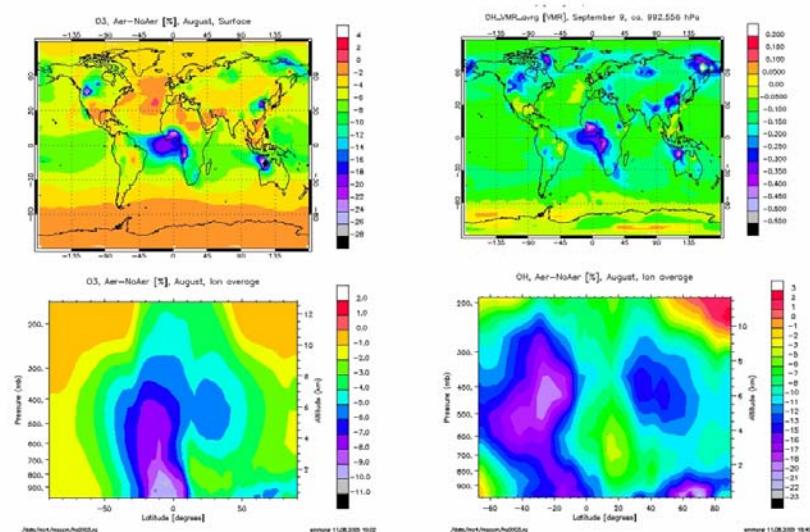
## Simulated Aerosol Species

- $\text{SO}_2$ ,  $\text{SO}_4$ , DMS
- $\text{NH}_3$ ,  $\text{NH}_4$ ,  $\text{NH}_4\text{NO}_3$
- OC (hydrophobic, hydrophilic)
- BC (hydrophobic, hydrophilic)
- Sea-salt (4 bins)
- SOA

### $\text{SO}_4$ at RSMAS sites

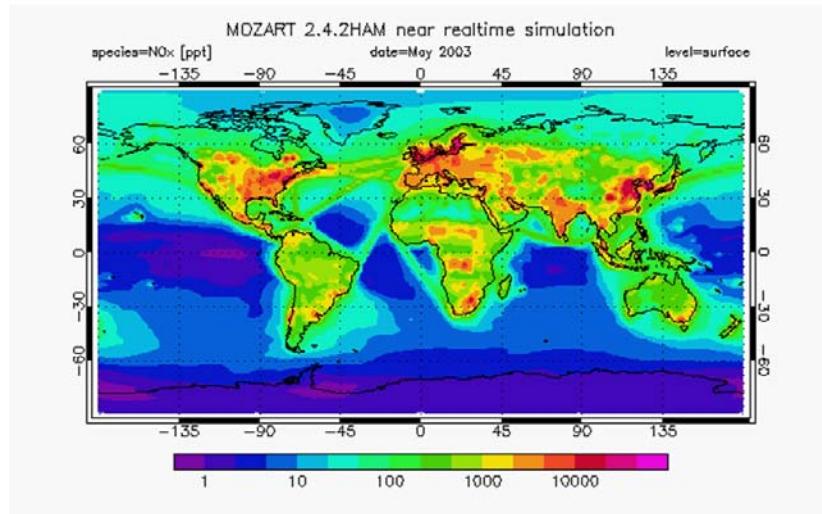


### Overall Effect of Aerosols [FTUV: Aerosols vs no aerosols]

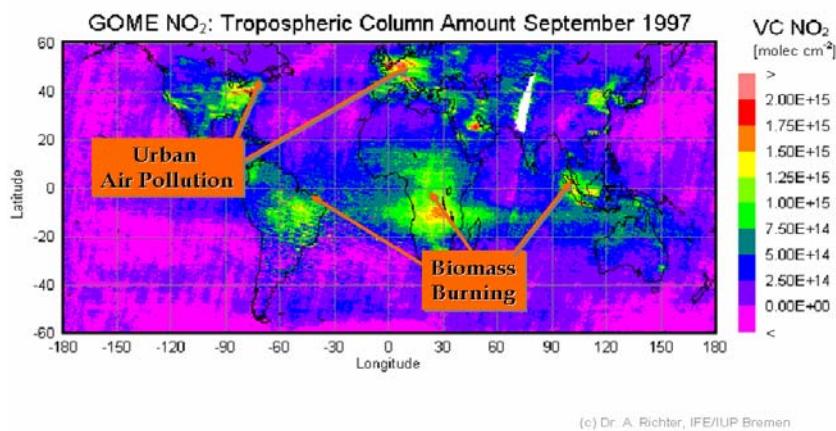


## Results from MOZART-2

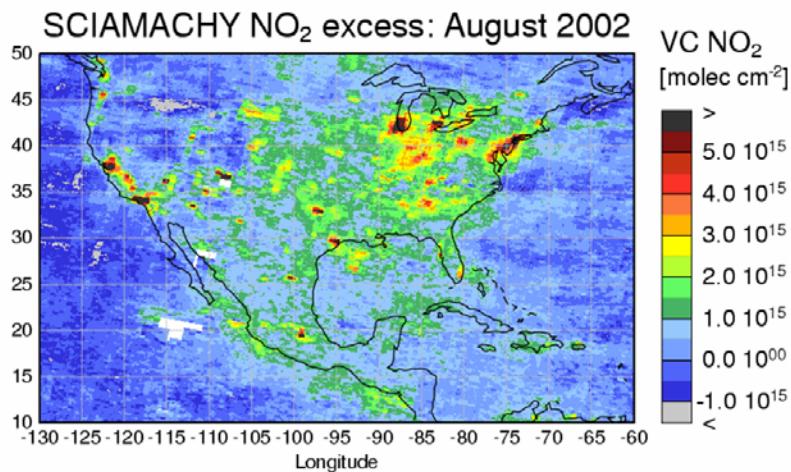
Nitrogen Oxides (pptv) May

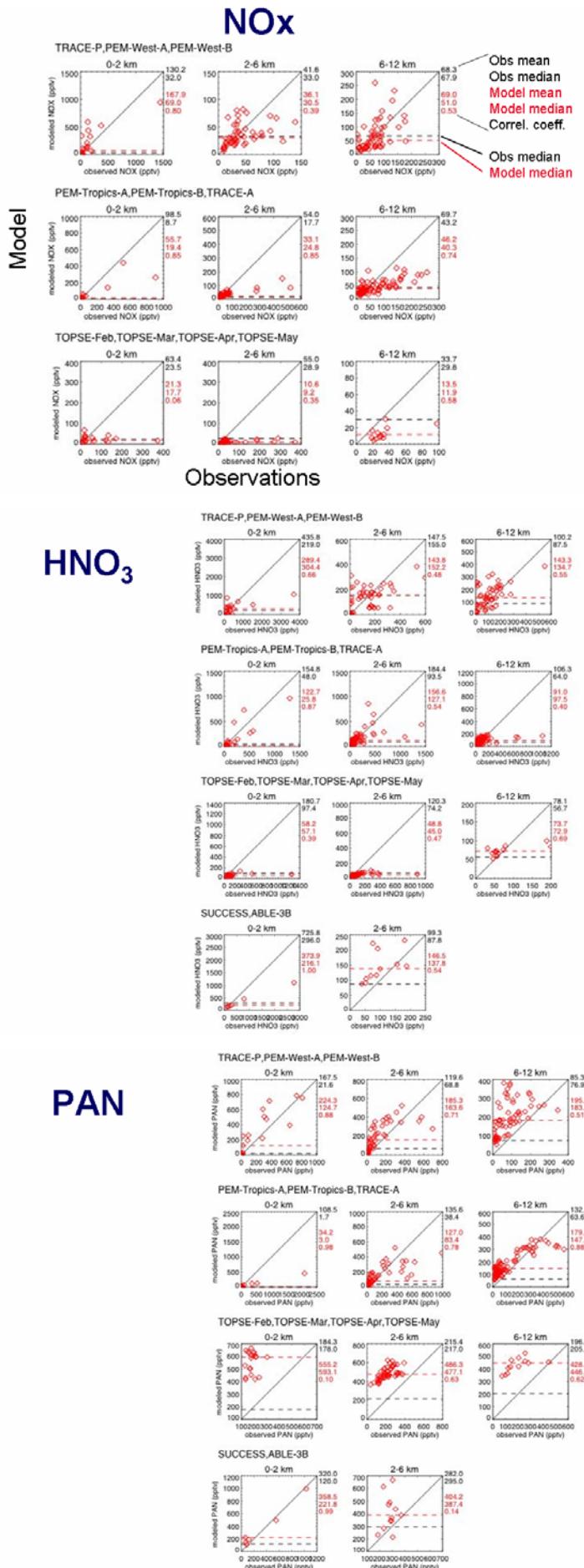


### Example: Air Pollution and Biomass Burning

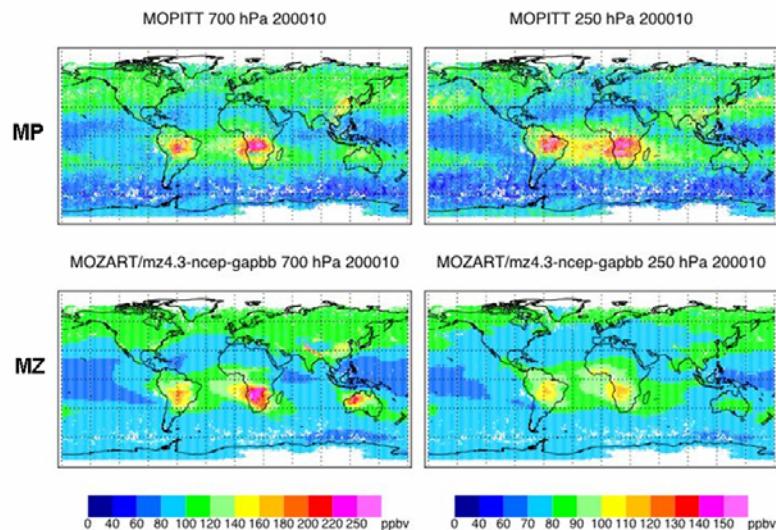


### Chemical Weather seen from Space

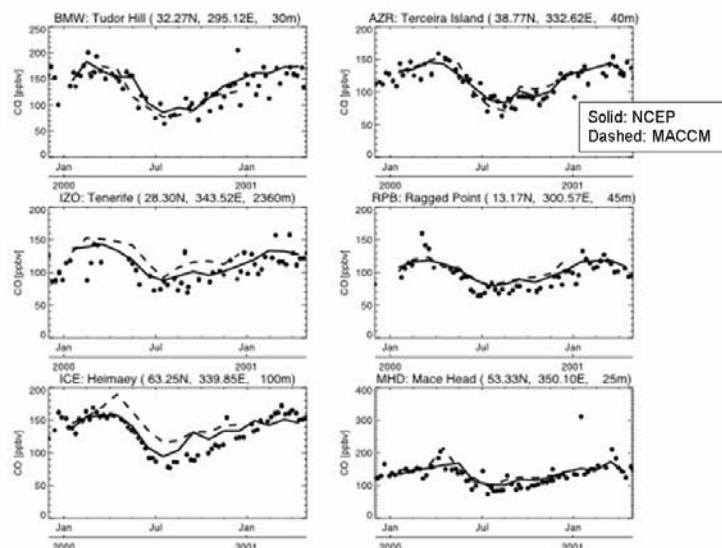




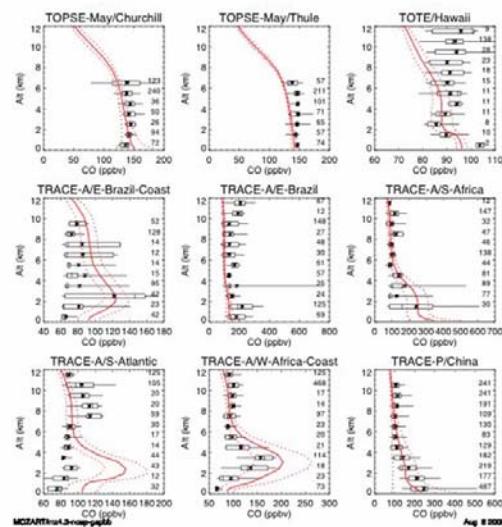
## MOPITT - October 2000



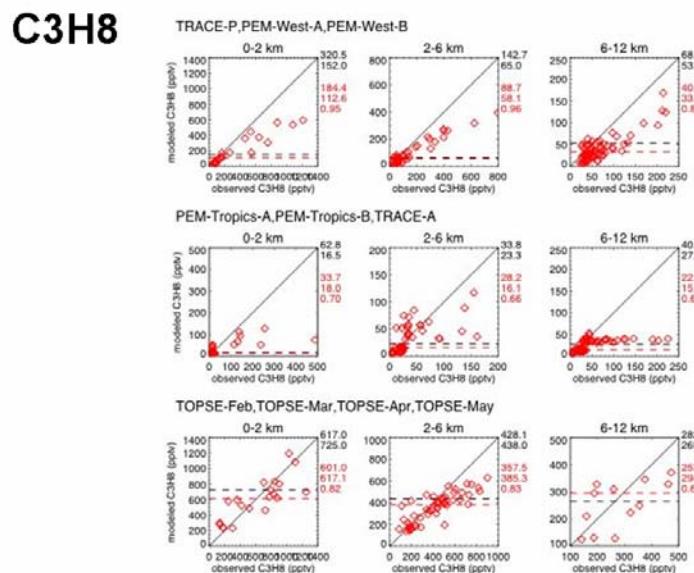
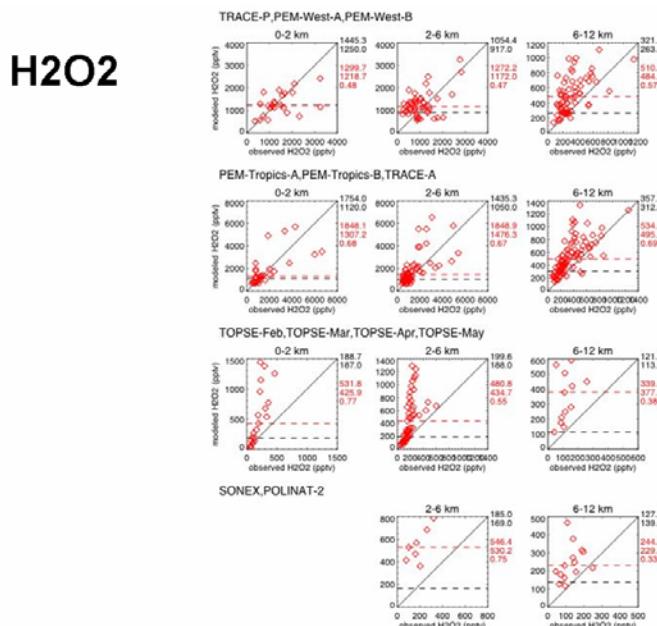
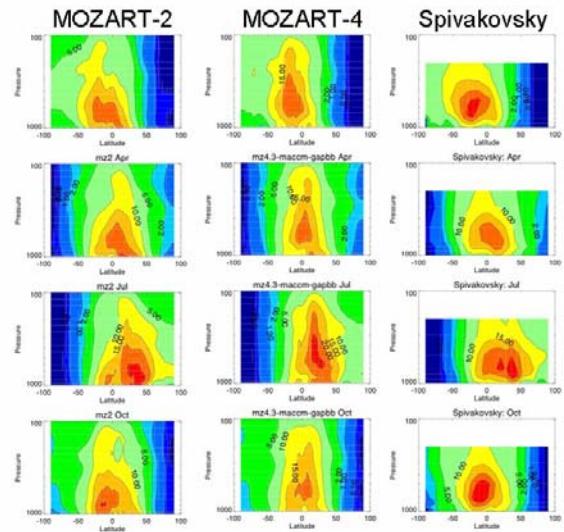
## CMDL CO - MZ4 - N.Atlantic

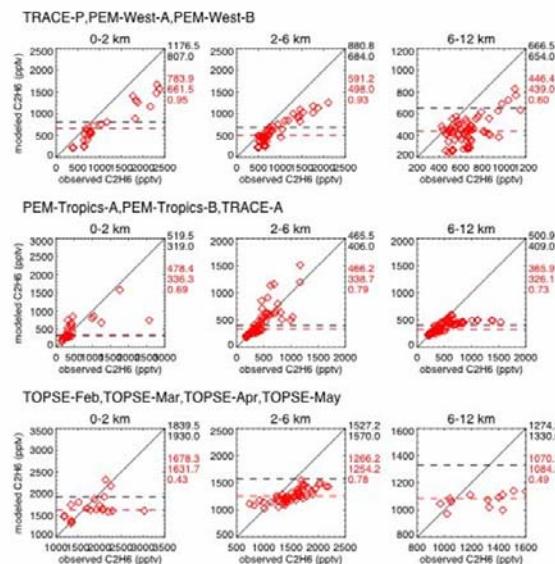
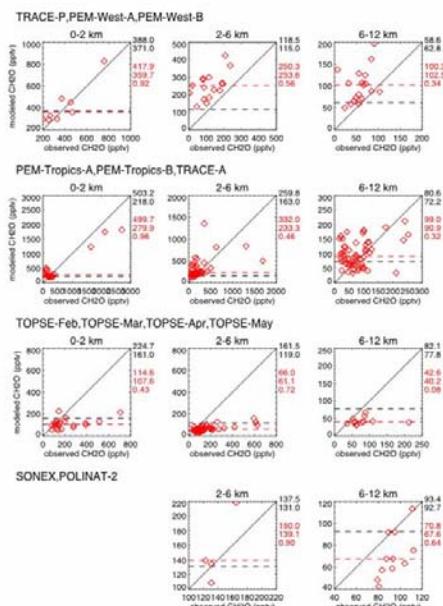
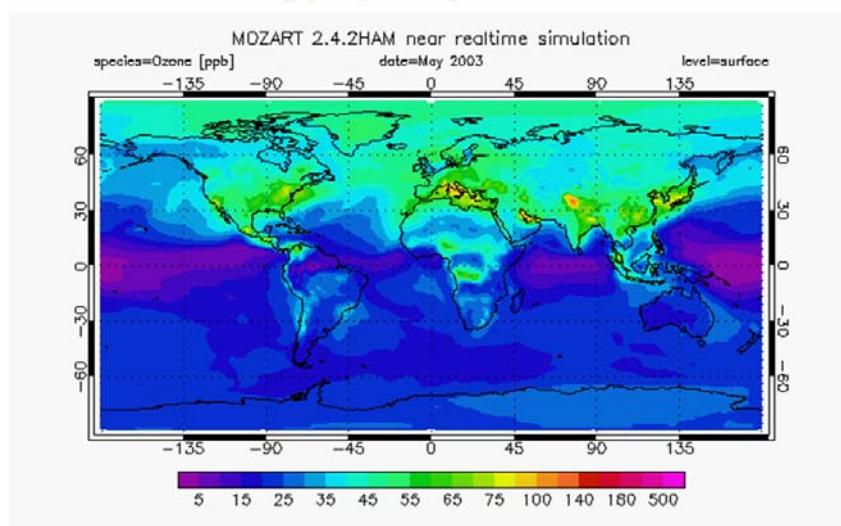


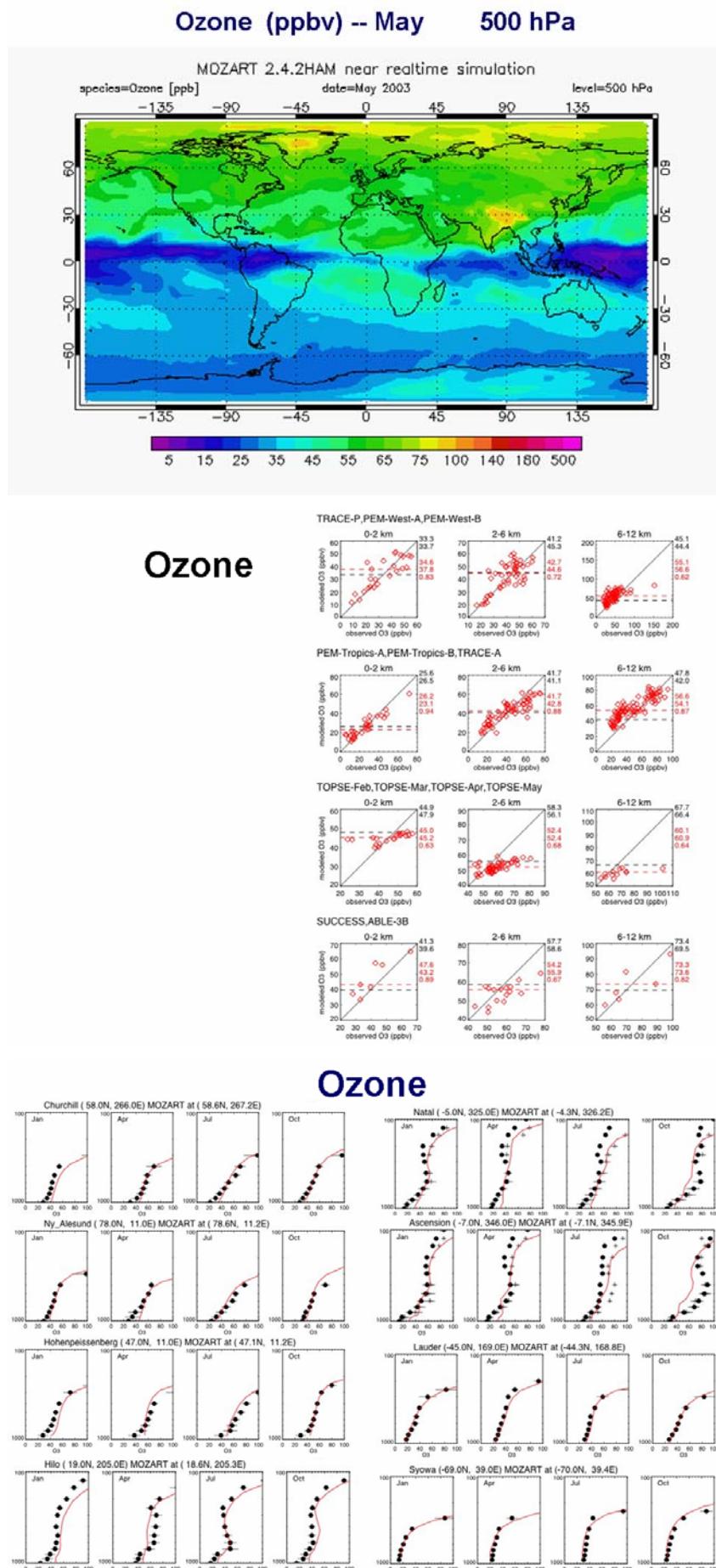
## Comparison to aircraft data



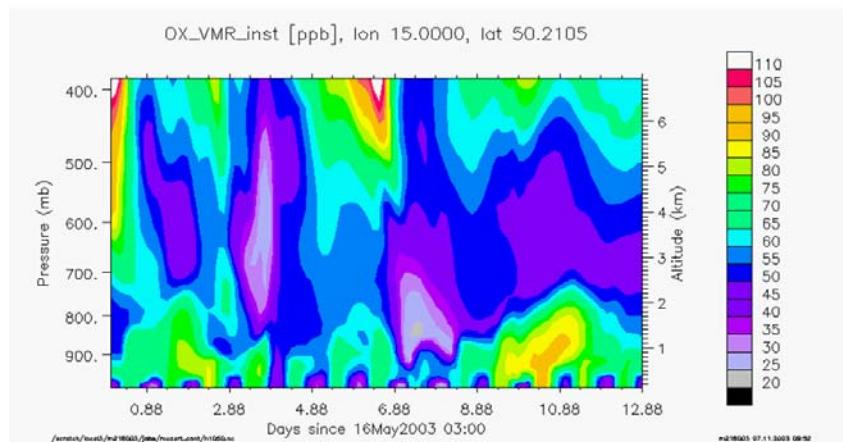
## OH - Zonal Average (MACCM)



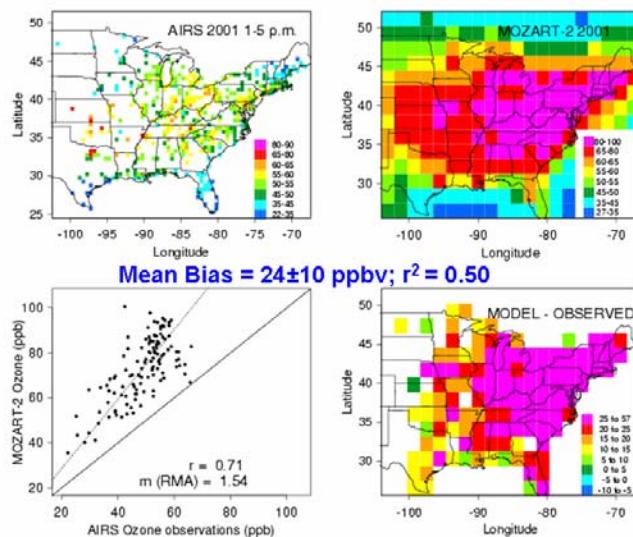
**C2H6****CH<sub>2</sub>O****Ozone (ppbv) -- May Surface**



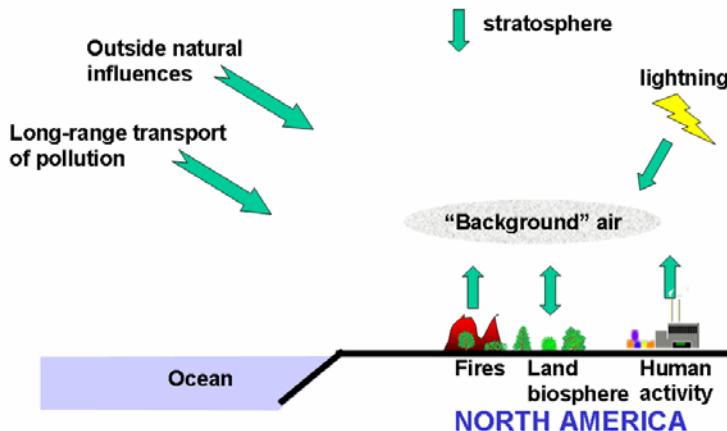
## Ozone Lindenberg, May 2003



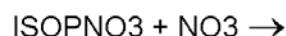
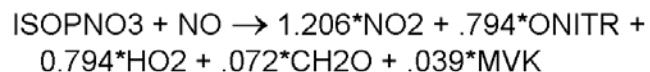
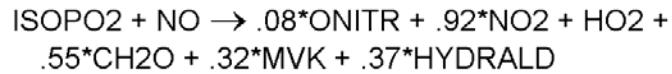
MOZART-2 Comparison with AIRS: July 2001 1-5 p.m. Surface O<sub>3</sub> (ppbv)



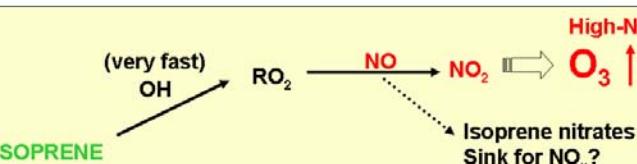
## Processes Contributing to Surface Ozone over North America



## Isoprene Nitrates

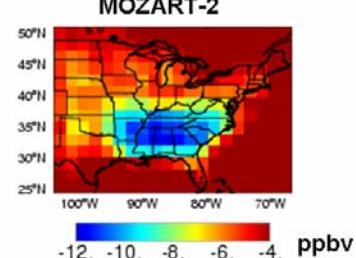


**Substantial O<sub>3</sub> sensitivity to the uncertain fate (and yield) of organic isoprene nitrates**



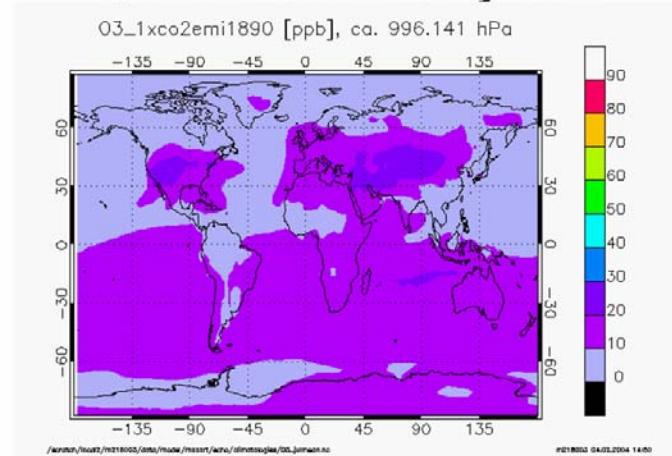
Change in July mean 1-5 p.m.  
surface O<sub>3</sub> when isoprene  
nitrates (at 12% yield)  
act as a NO<sub>x</sub> sink

→ 4-12 ppbv impact!

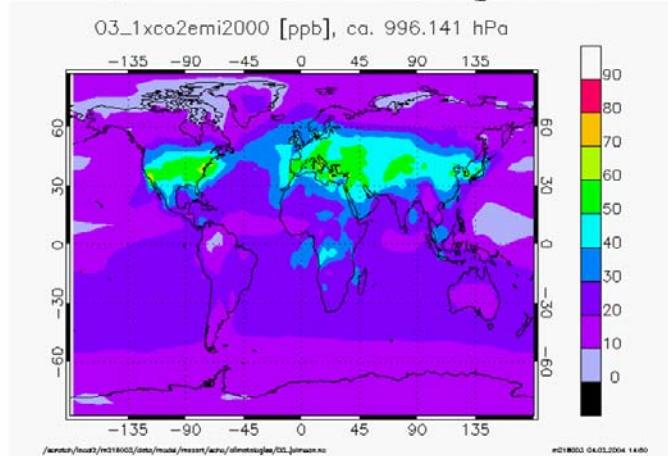


*Fiore et al., JGR, 2005*

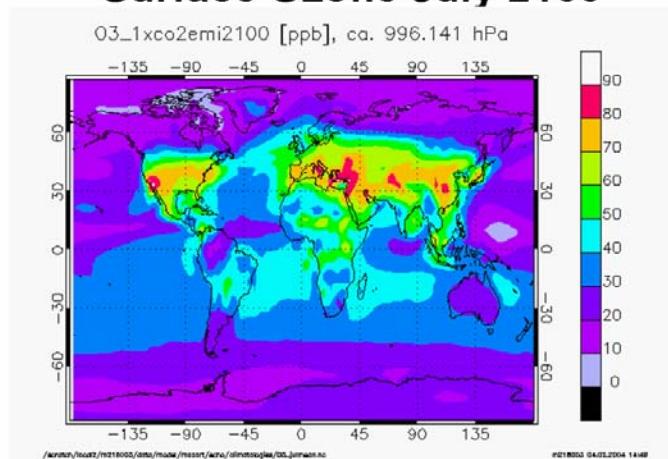
## Surface Ozone July 1890



### Surface Ozone July 2000



### Surface Ozone July 2100



A2 Scenario SRES



### MOZART-3 Set-up



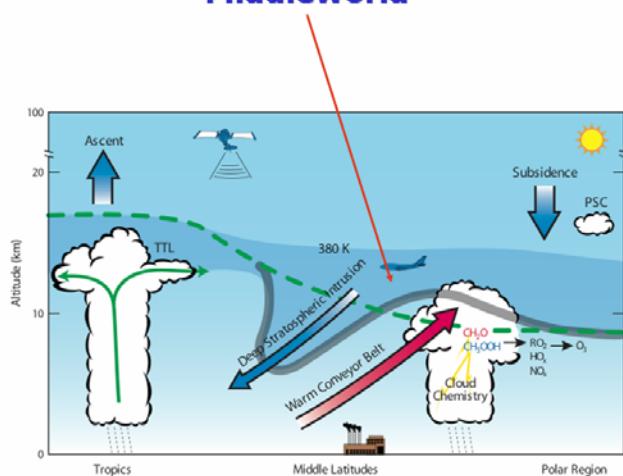
- Extension of Tropospheric MOZART-2 and -4
  - 106 Species Mechanism (250 chemical and photochemical reactions- JPL-02).
    - CO, CO<sub>2</sub>, CH<sub>4</sub>, H<sub>2</sub>O, N<sub>2</sub>O, CFC-11, CFC-12, CFC-113, HCFC-22, CH<sub>3</sub>Cl, MCF, CCl<sub>4</sub>, CH<sub>3</sub>Br, H1211, H1301, organics
  - Radicals contained in: Ox, HOx, NOx, ClOx, and BrOx families
  - Heterogeneous Chemistry: Includes sulfate, nitric acid hydrate, and H<sub>2</sub>O-ice aerosols

### MOZART-3 Set-up



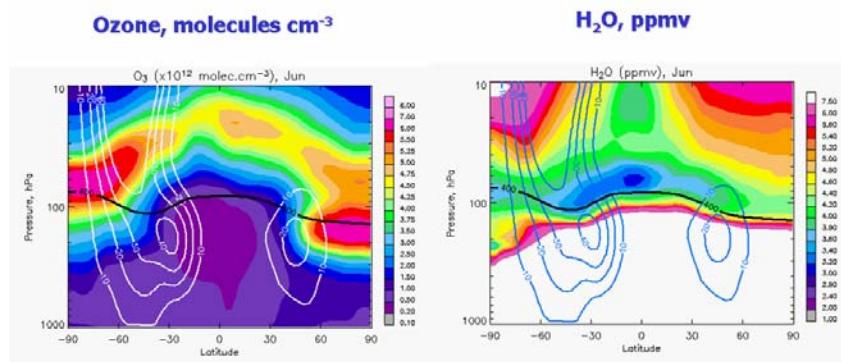
- Extension of Tropospheric MOZART-2 and -4
- Look-up table parameterization (STUV; 4-stream; 121-750nm)
- Surface Emissions (POET; C. Granier)
- Meteorological Fields
  - WACCM1b (2.8x2.8; 66 levels, 0-150 km)
  - ECMWF Operational (1.9 x 1.9; 60 levels, 0-65 km)
  - ECMWF ERA-1 (TBD)

### Middleworld



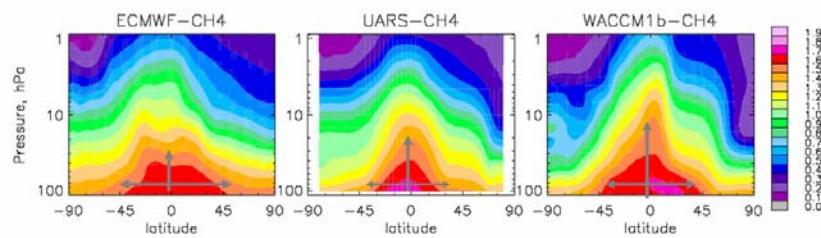
Courtesy of Laura Pan, NCAR

### Mozart-3 / WACCM1b - June

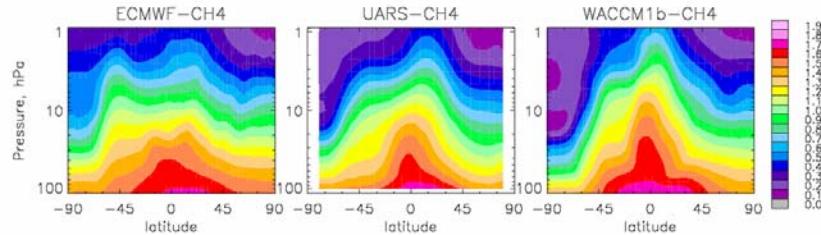


### Comparison of Long-lived Tracers - CH<sub>4</sub> (ppmv)

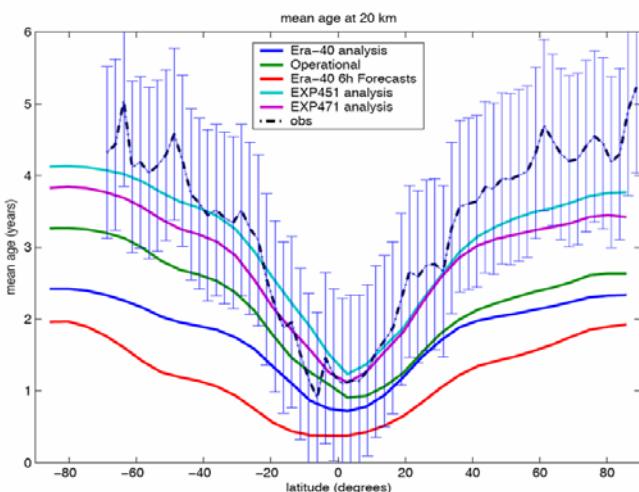
January



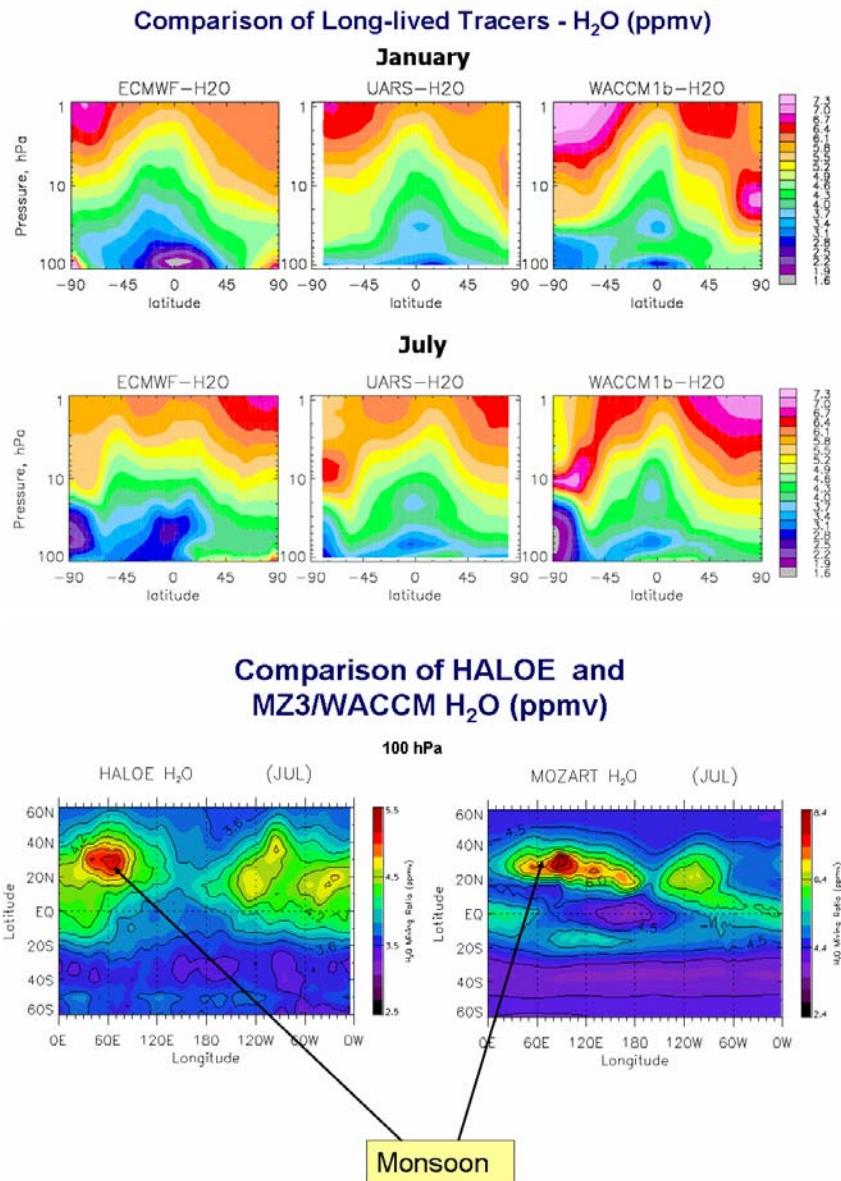
July



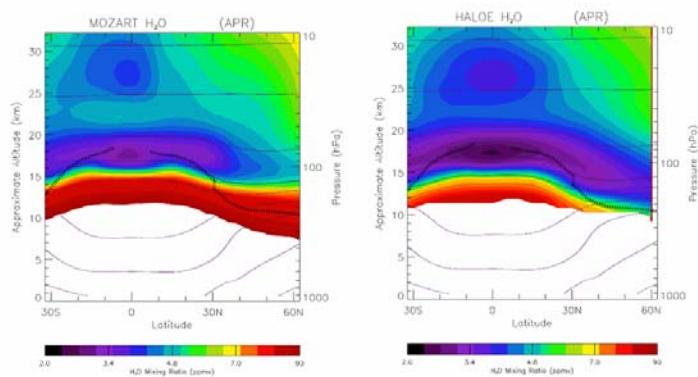
### ECMWF Age-of-Air

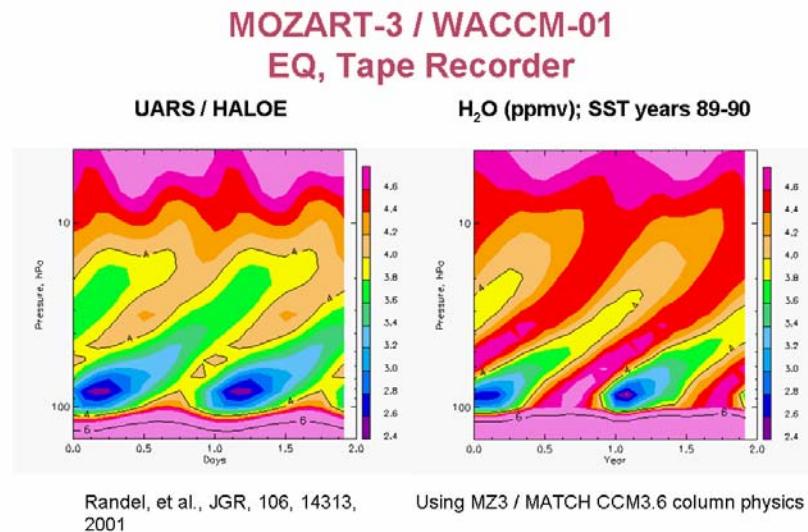


Courtesy of Simmons, ECMWF

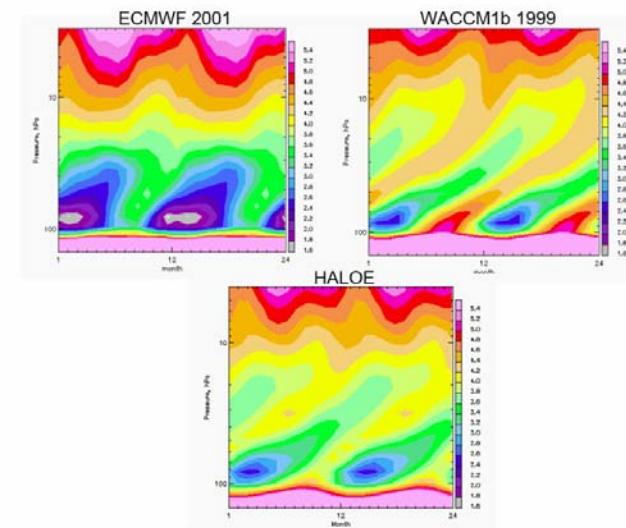


**Comparison of HALOE and MOZART3/WACCM H<sub>2</sub>O – Park et al. 2003**

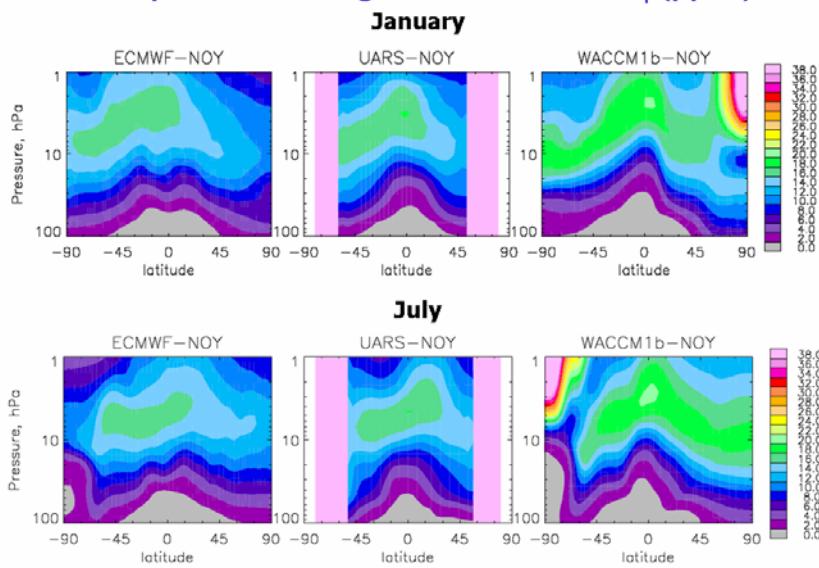




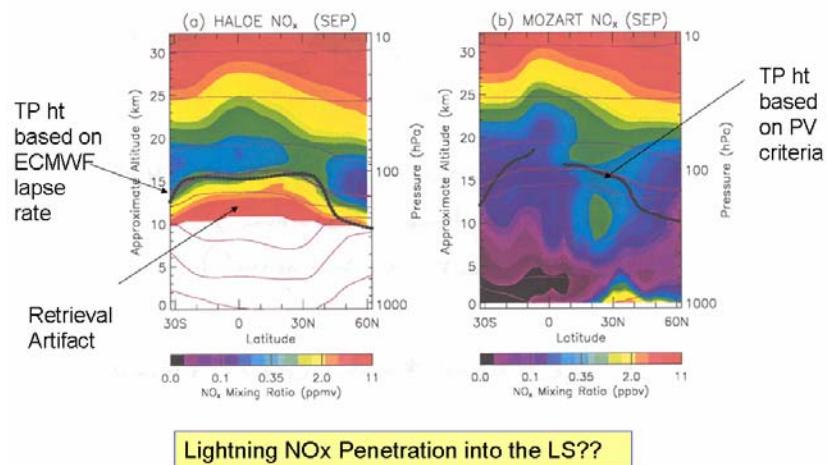
### Comparison of Long-lived Tracers - H<sub>2</sub>O (ppmv)



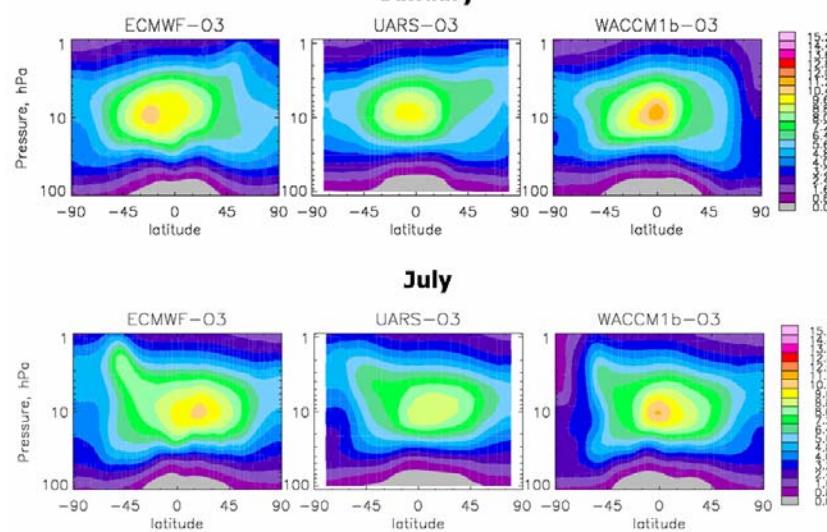
### Comparison of Long-lived Tracers - NO<sub>Y</sub> (ppbv)



### Meridional Cross Section of NO<sub>x</sub> in the South Asian Monsoon Region (60-120E), Sept

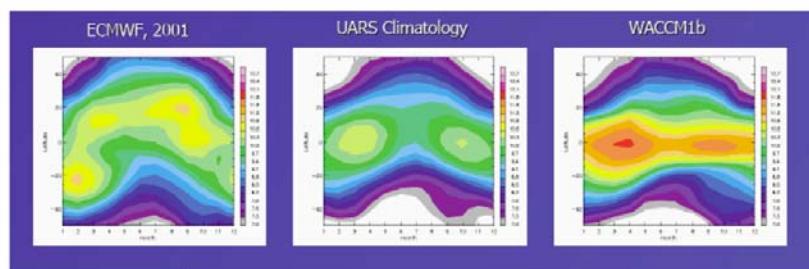


### Comparison of Long-lived Tracers - O<sub>3</sub> (ppmv)

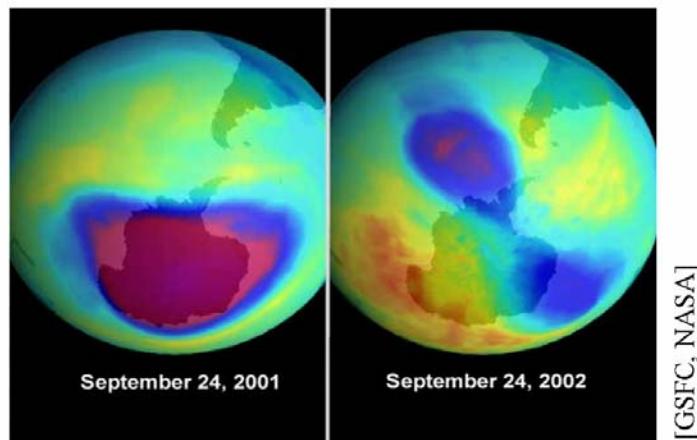


### Comparison of Long-lived Tracers - O<sub>3</sub> (ppmv)

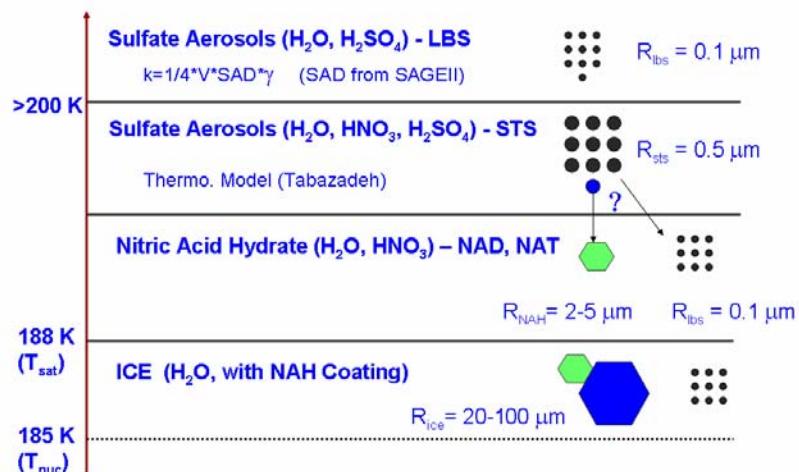
#### O<sub>3</sub> at 10hPa



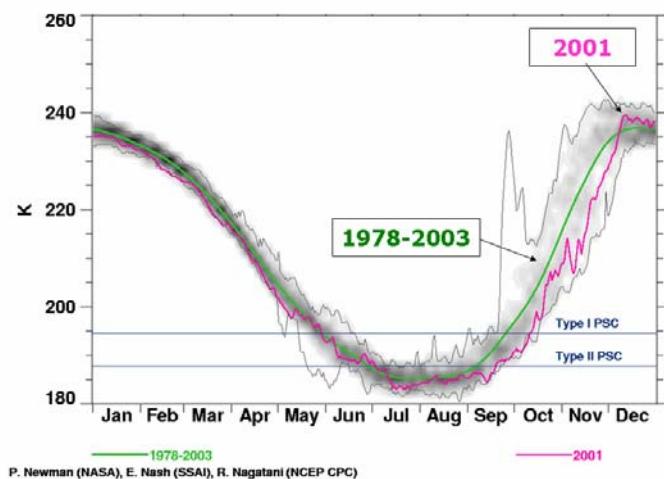
## Modeling the Antarctic ozone hole 2001/2002



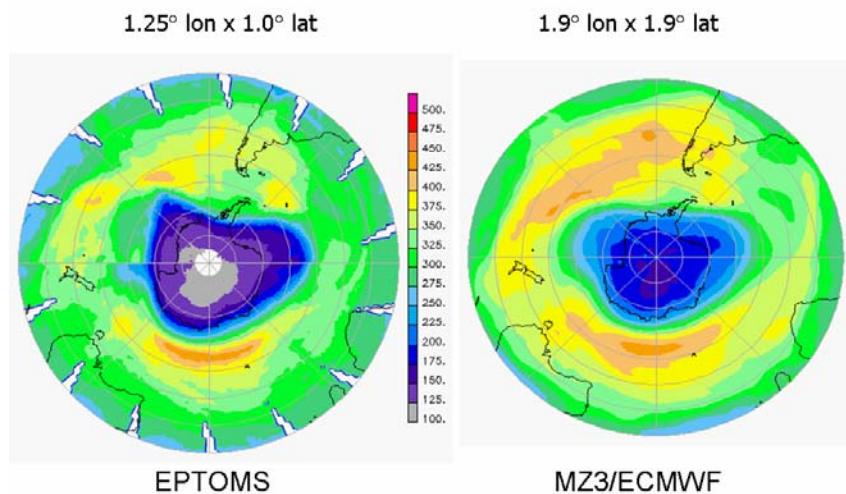
### Heterogeneous Chemistry Module



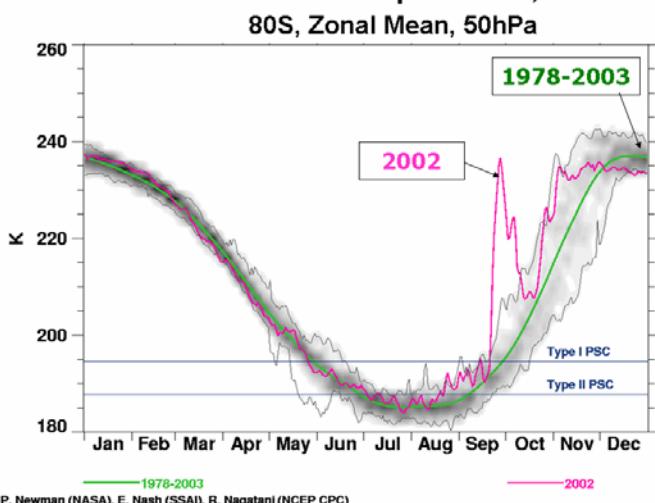
### NCEP CPC Temperatures, 2001 80S, Zonal Mean, 50hPa



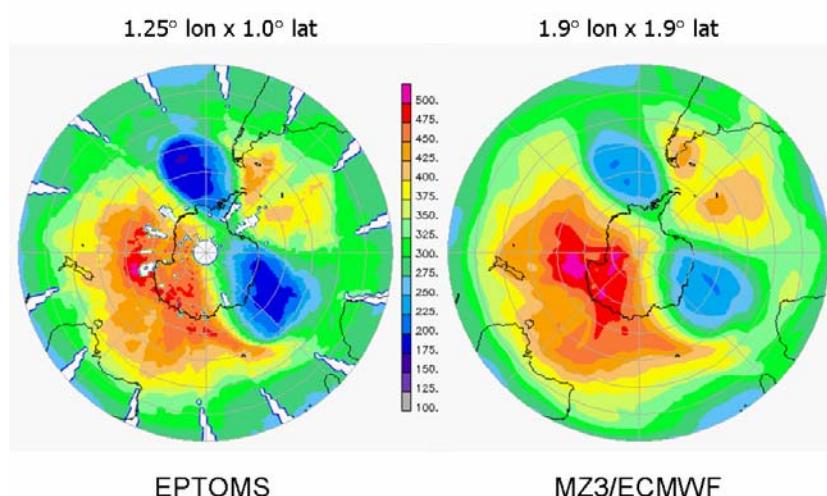
**Total Column Ozone (DU) September 25, 2001**



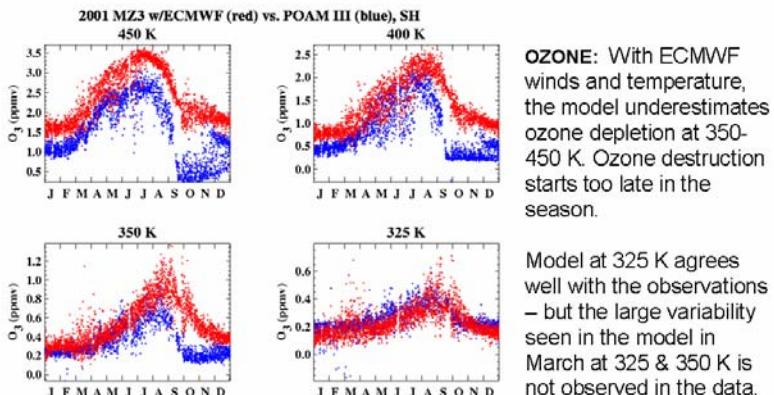
**NCEP CPC Temperatures, 2002**



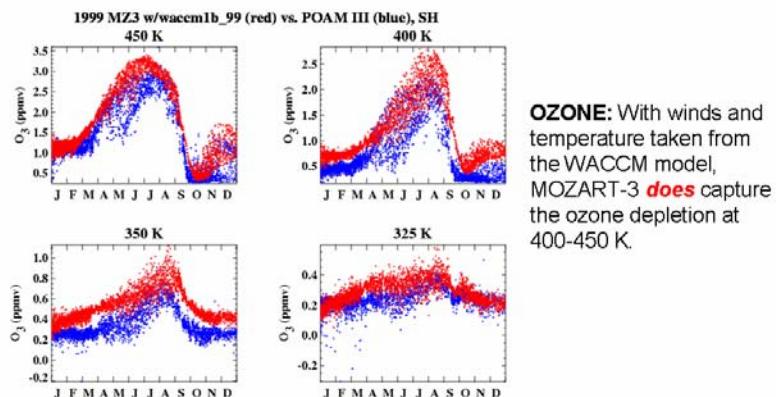
**Total Column Ozone (DU) September 25, 2002**



### OZONE: Point-by-point time series, lower strat, SH



### OZONE: Point-by-point time series, lower strat, SH



### Inorganic Chlorine (ppbv)

