

*“ and now, for something
completely different ... ”*

**Cloud-Scale Mass Fluxes and
Tracer Transport Inversions:
New Ways to Study the
Global Carbon Cycle From the Air**

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Climate Change Research Initiative

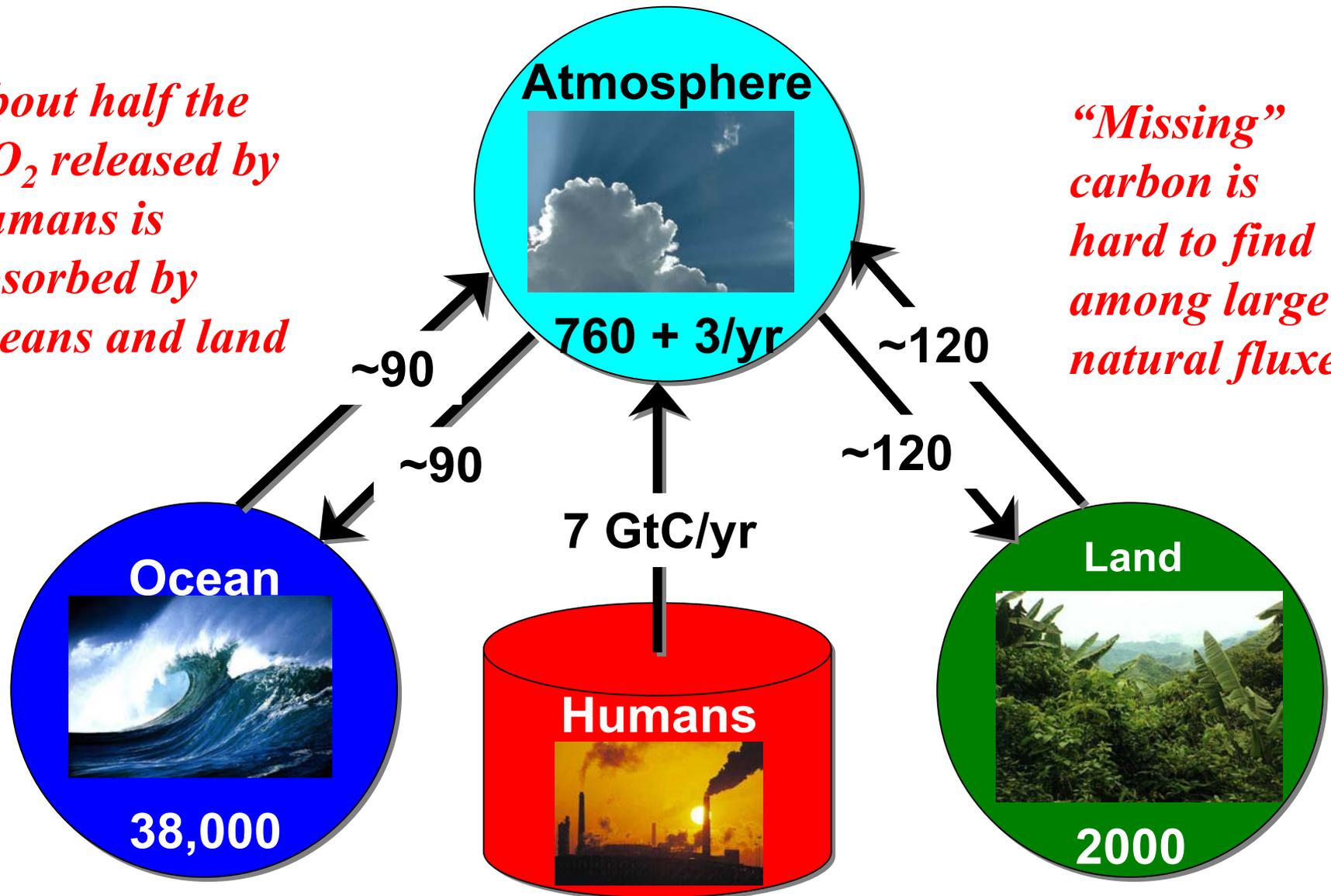
1. What **aerosols** are contributing factors to climate change and what is their relative contribution to climate change?
2. What are the magnitudes and distributions of North American **carbon sources and sinks**, and what are the processes controlling their dynamics?
3. How much of the expected climate change is the consequence of feedback processes? (**clouds**)

The proposed STC is well positioned to contribute substantially to every one of these highest-priority research questions!

The Global Carbon Cycle

About half the CO₂ released by humans is absorbed by oceans and land

“Missing” carbon is hard to find among large natural fluxes



The "Missing Sink"

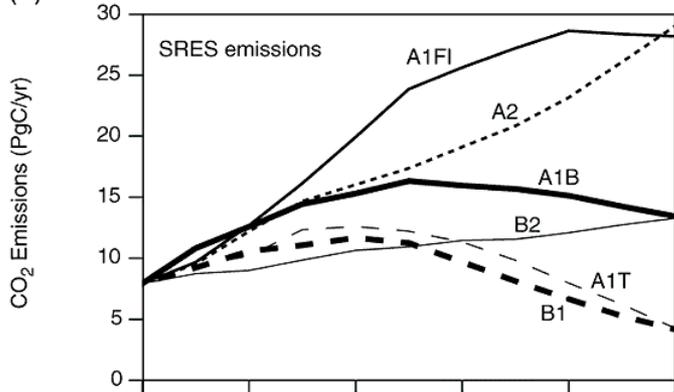
- Terrestrial and marine exchanges currently **remove more than 3 GtC per year from the atmosphere**
- This free service provided by the planet constitutes an **effective 50% emissions reduction, worth at least \$30 Billion per year** if we had to provide it through policy changes
- Science is currently **unable to quantitatively account** for
 - The **locations** at which these sinks operate
 - The **mechanisms** involved
 - How long the carbon will **remain stored**
 - How long the sinks will **continue to operate**
 - Whether there is **anything we can do** to make them work better or for a longer time

Where Has All the Carbon Gone?

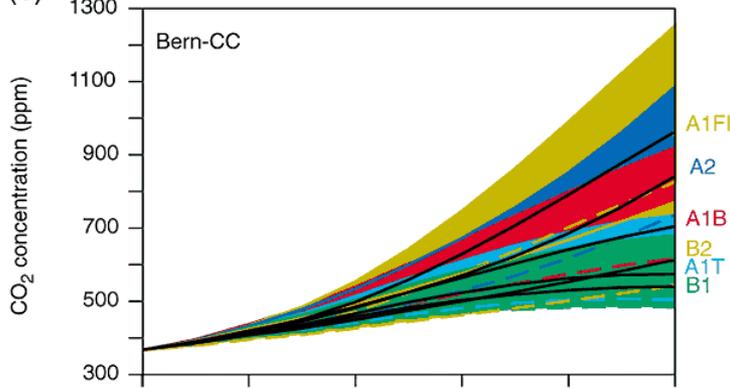
- Into the **oceans**
 - **Solubility pump** (CO_2 very soluble in cold water, but rates are limited by slow physical mixing)
 - **Biological pump** (slow "rain" of organic debris)
- Into the **land**
 - **CO_2 Fertilization**
(plants eat CO_2 ... more is better)
"the gift that keeps on giving"
 - **Nutrient fertilization**
(N-deposition and fertilizers)
 - **Land-use change**
(forest regrowth, fire suppression, woody encroachment ...)
 - **Response to changing climate**
(e.g., Boreal warming)

CO₂ Sensitivity

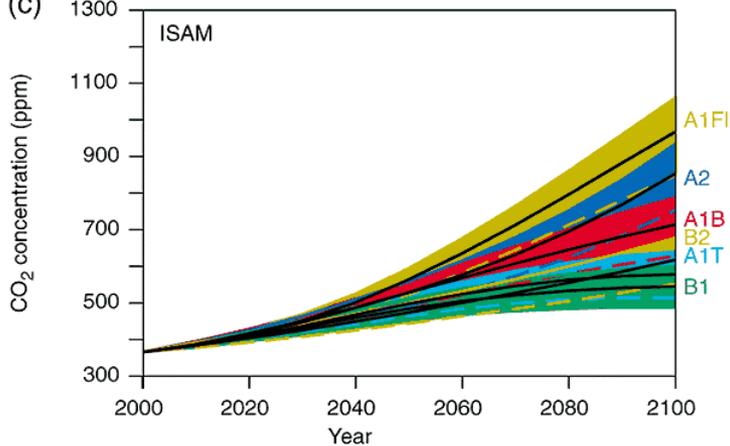
(a)



(b)



(c)



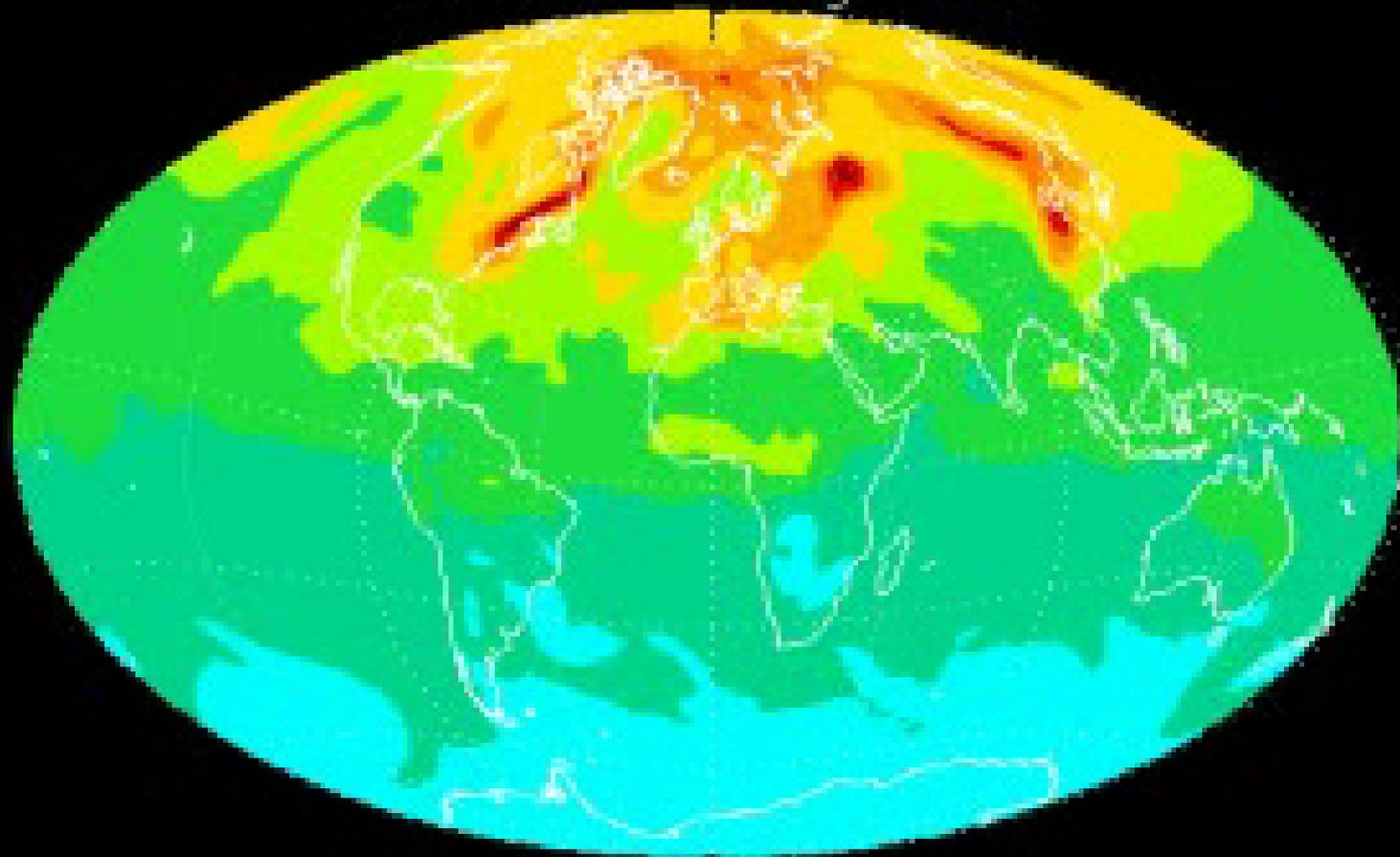
- Each carbon cycle model also produced a "high" and "low" estimate
- In Bern-CC, the **high estimate assumed current sinks are not primarily driven by CO₂ fertilization, so capped them at 2000 levels**
- **This resulted in nearly 300 ppm extra CO₂ in 2100!**
- Only the "central" estimates, with sinks scaling with CO₂, were used in climate scenarios

The Atmosphere as a Blurry Lens

- We use the atmosphere to help us understand carbon cycle processes that act at the surface
- From the "bottom up," we develop process-based models of sources and sinks, then test them by evaluating against atmospheric data collected at many scales
- From the "top down," we use inverse modeling and data assimilation techniques to estimate source and sink strengths by mass balance, from variations in the CO_2 mixing ratio

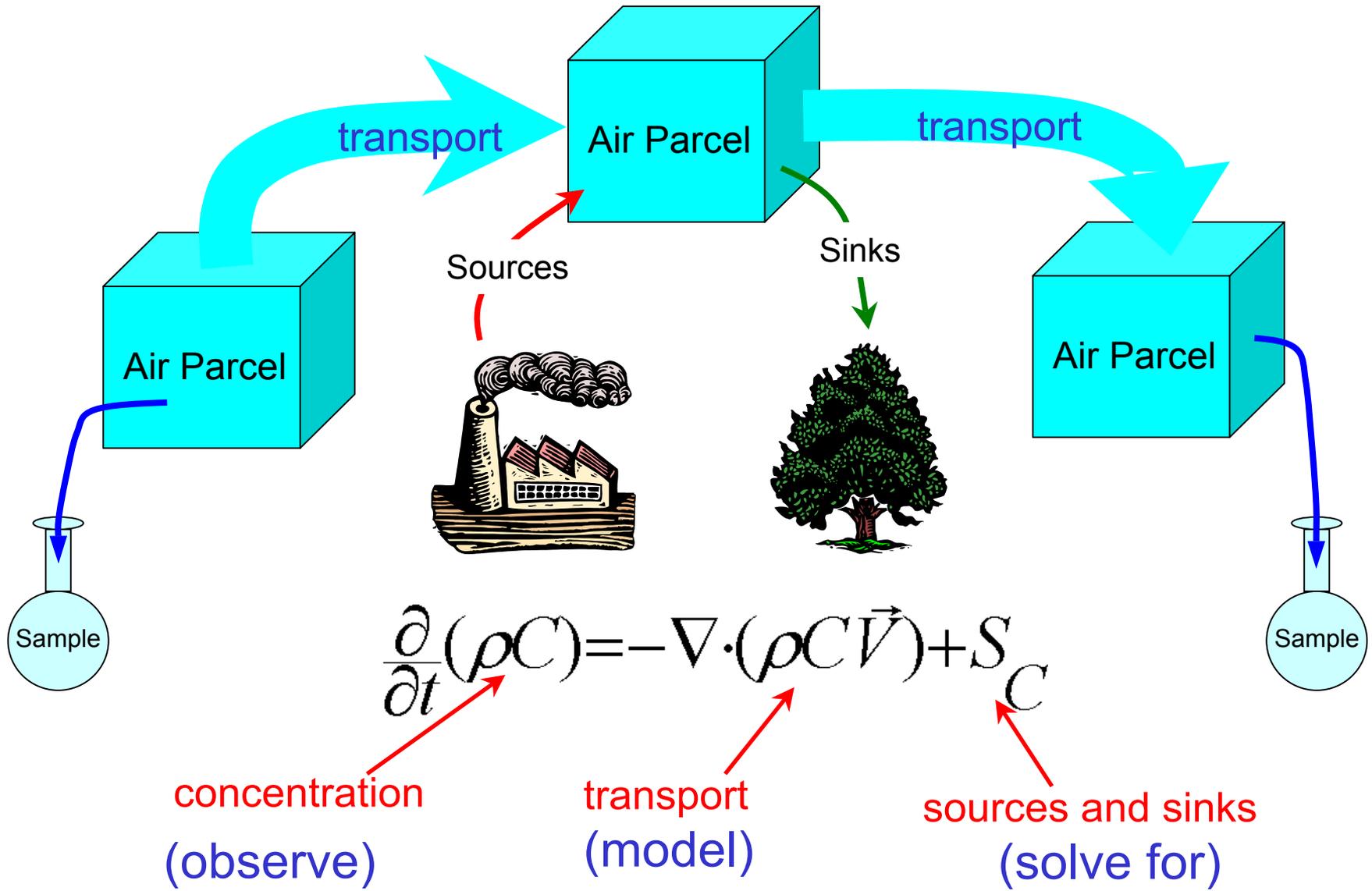
CTM e408 CO2 1998-12

Column Mixing Ratio

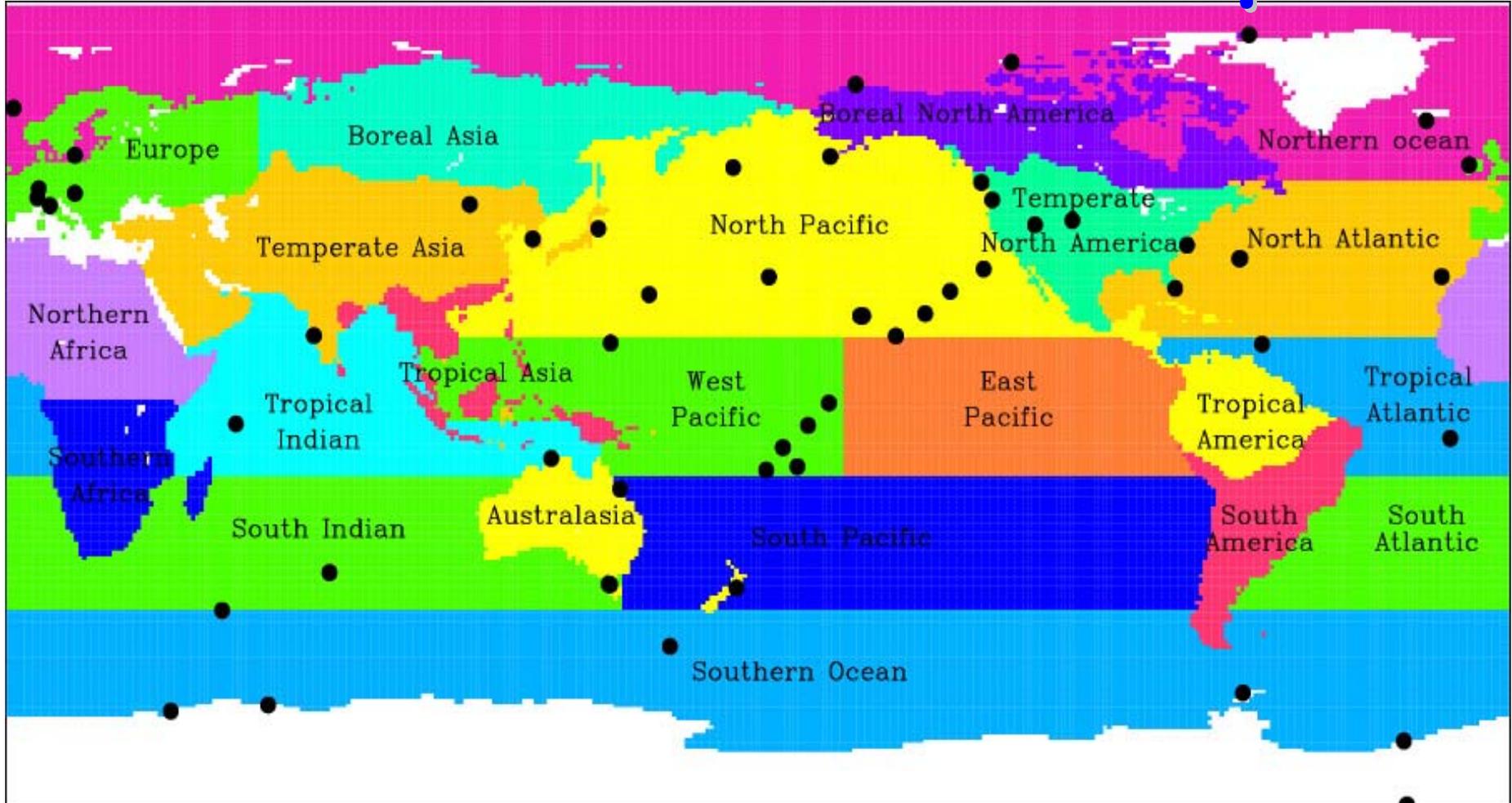


Randy Kawa, GSFC

Inverse Modeling of CO₂



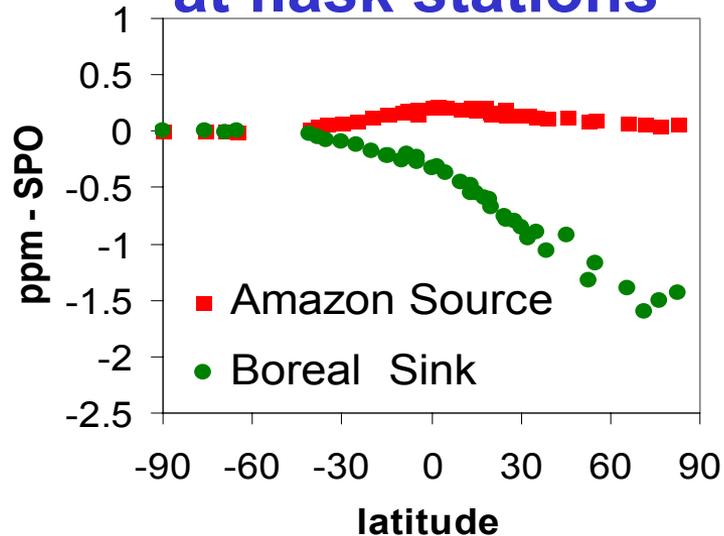
Global Inversion Setup



- Compute Green's Functions for monthly emission pulses from each of 22 regions in each of 12 months in each of 16 transport models
- Estimate monthly CO_2 fluxes by optimizing to monthly observations at ~ 75 (mostly remote) sites

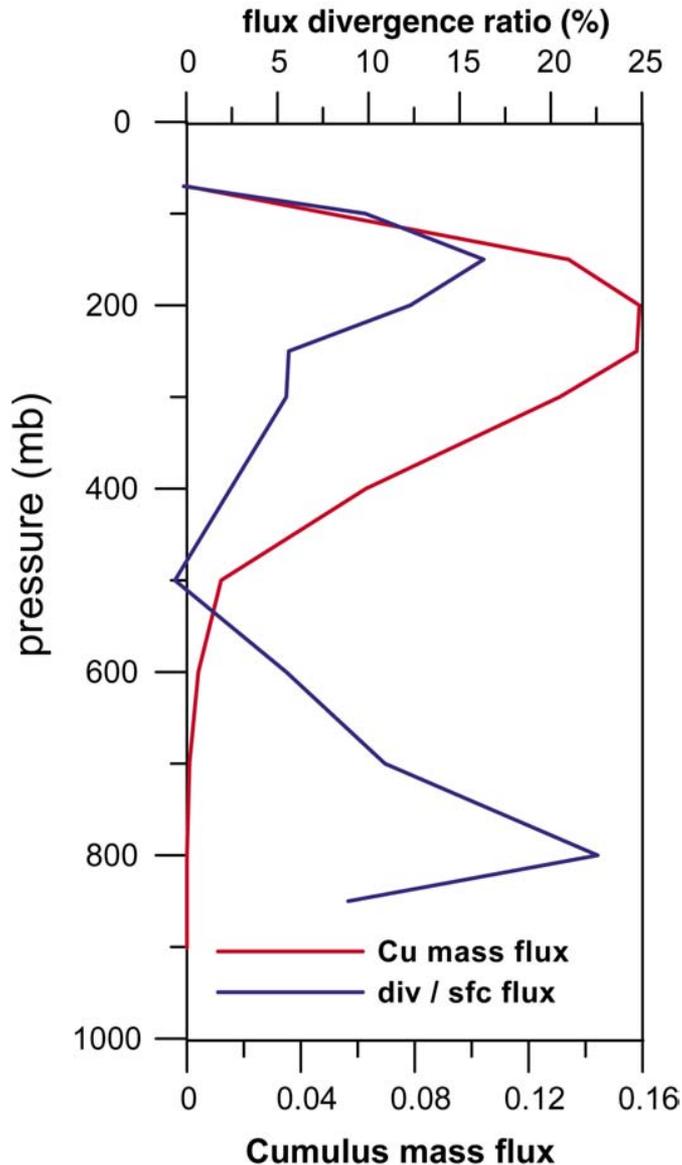
Unconstrained Tropical Fluxes

Simulated Concentrations at flask stations



- Concentration response due to a 1 GtC/yr flux in the Amazon is much weaker than response due to a 1 GtC/yr flux in boreal forest
- This weak response is also poorly sampled in near the tropical continents

Convective "Leakage"

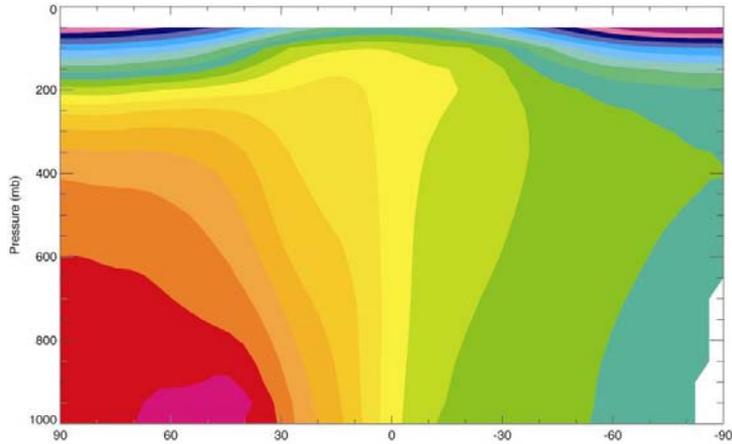


- Photosynthesis and cumulus convection are correlated in time and space in parts of the deep tropics
- Convective updrafts carry much of the "signal" of ecosystem flux aloft
- As much as 30% of the flux due to ecosystem metabolism leaves the atmospheric column in the upper troposphere, but nobody is looking there!

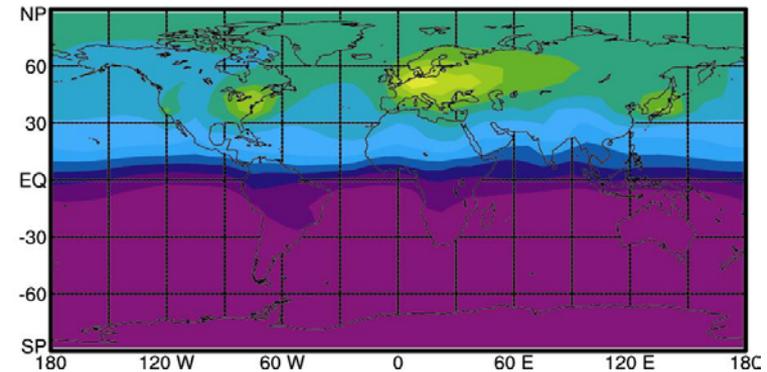
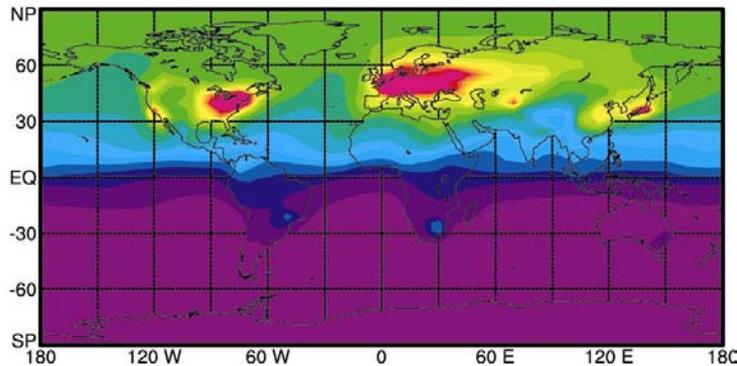
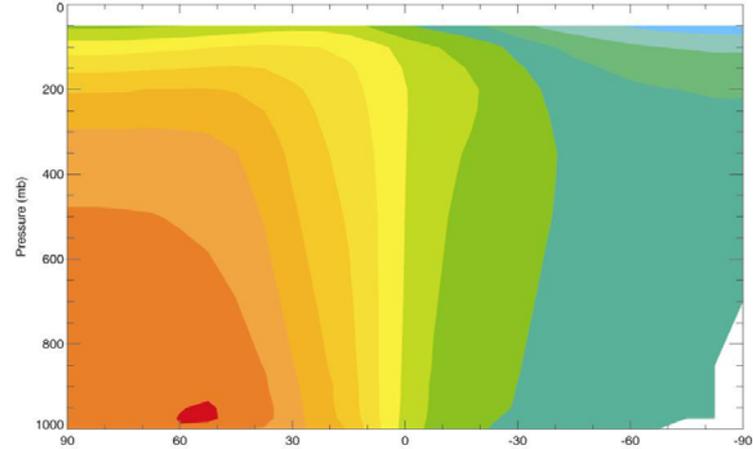
Two Views of the World

simulated annual mean SF₆

TM3

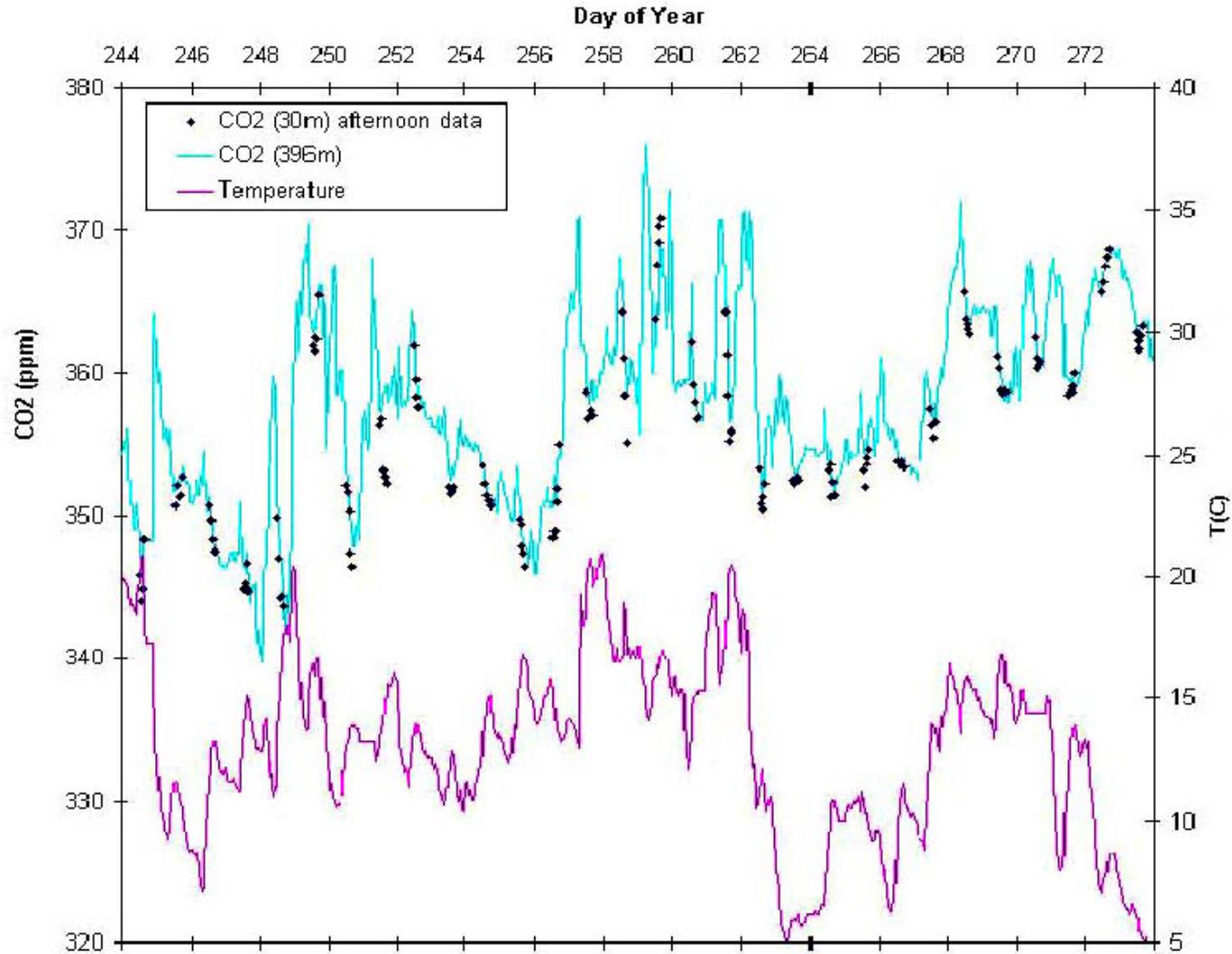


TM2



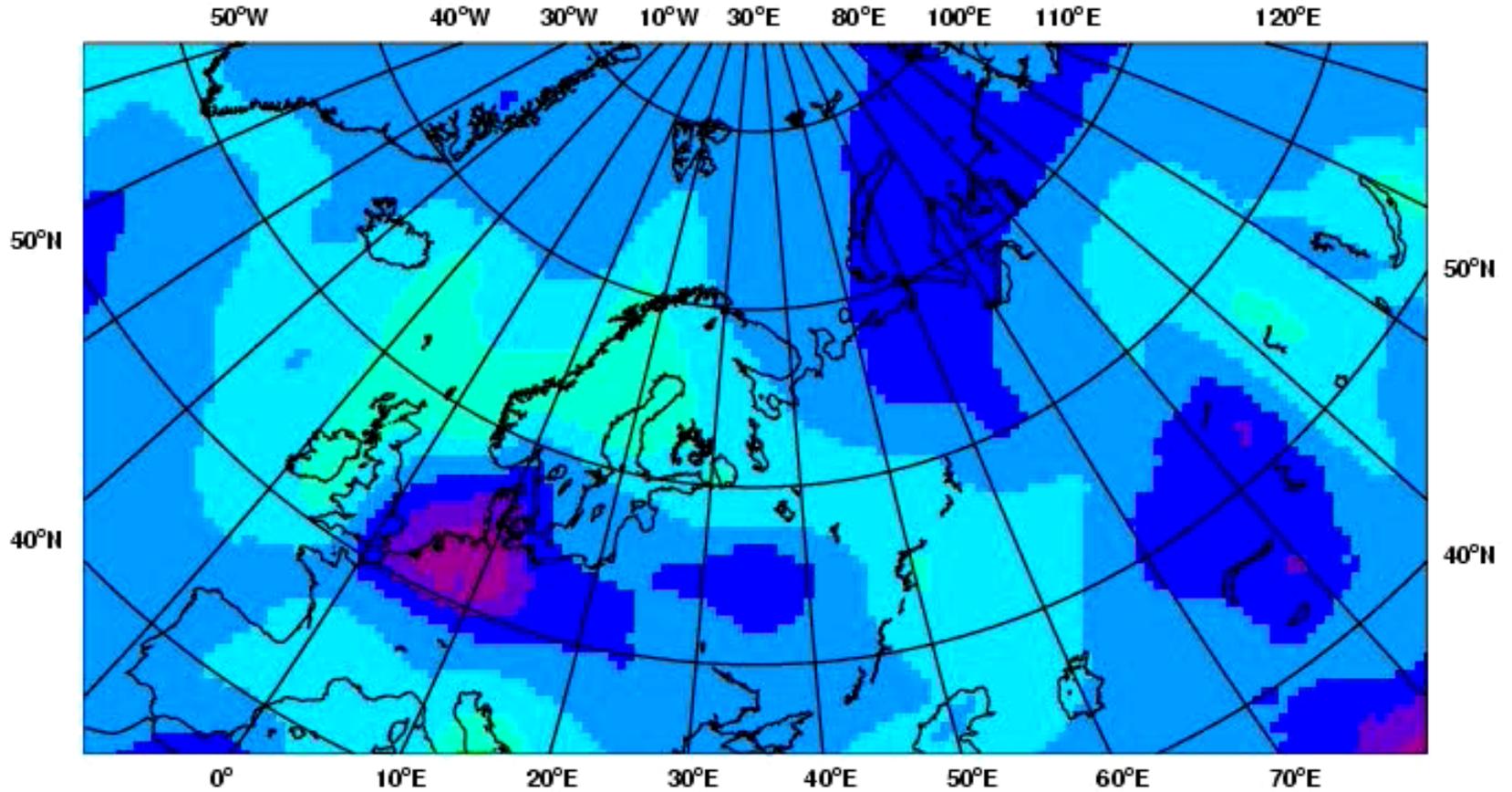
Two leading transport models using the same ECMWF winds, but different convective transport schemes

Huge Regional Signal!



Variations of ~ 30 ppm at WLEF on synoptic time scales strongly correlated to frontal passages

REMO 0.5°



01 JUL 1998 01 UTC

CO₂ BIO + FOSSIL + OCEAN [ppm]

Level = 18

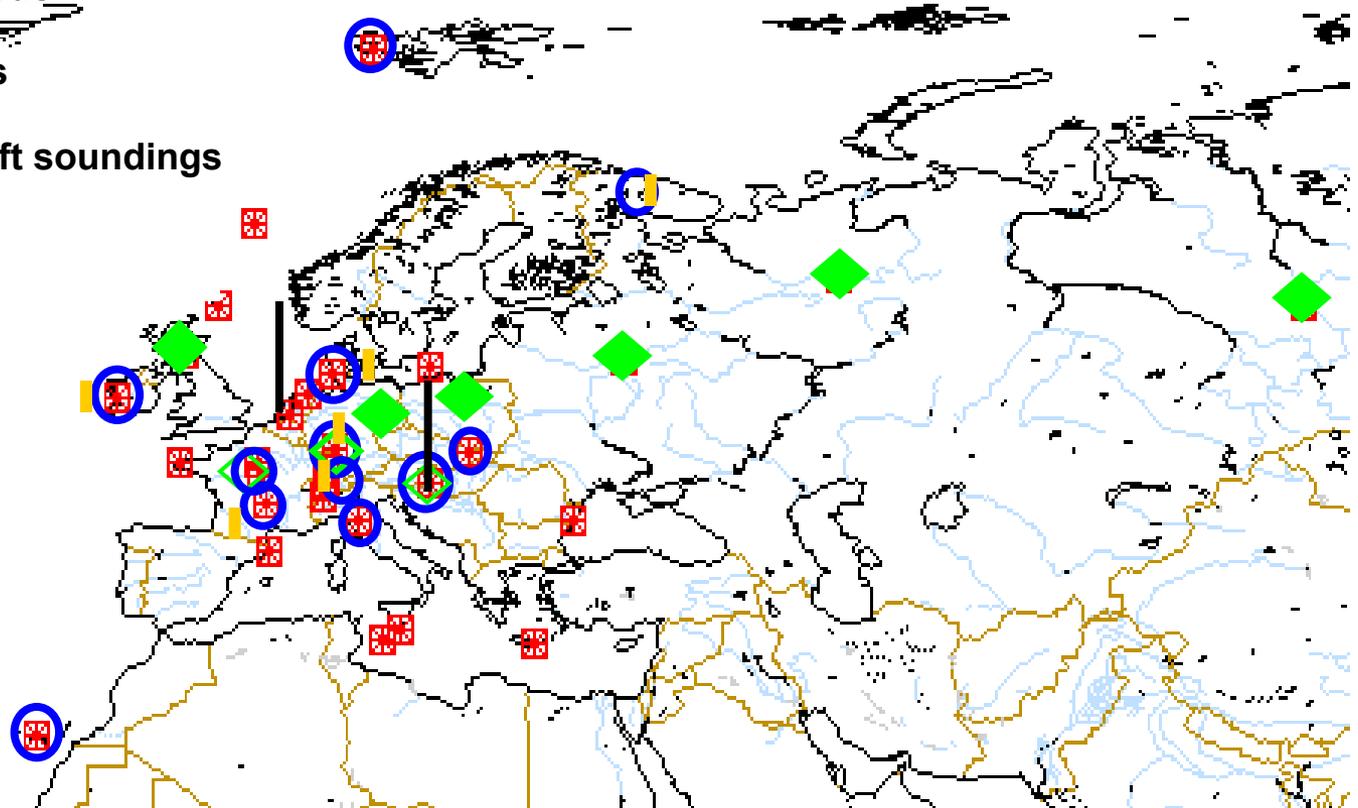


TURC/NDVI Biosphere, Takahashi Ocean, EDGAR Fossil Fuel

(Ute Karstens and Martin Heimann, 2001)

European Observations of Atmospheric CO₂

- Rn-222 continuous
- CO₂ continuous
- ◇ bi weekly aircraft soundings
- weekly flasks
- | tall towers CO₂

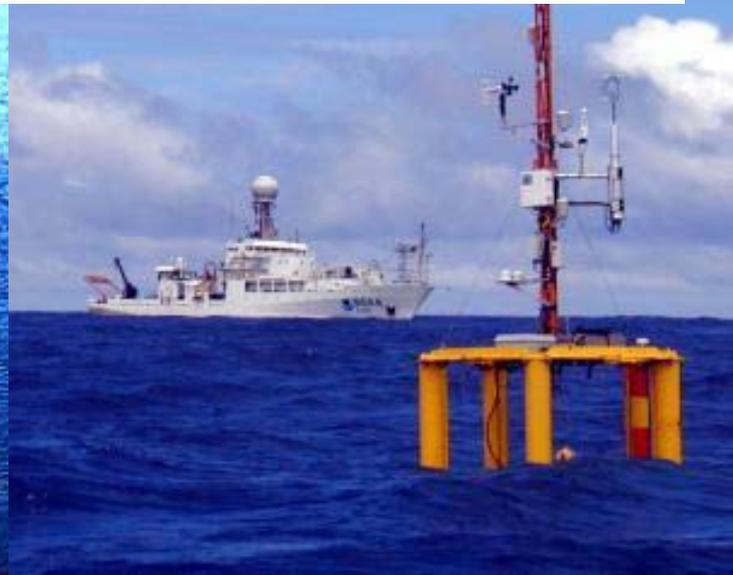


* Map of European atmospheric network in 2001 (7 european labs , CMDL, CSIRO)

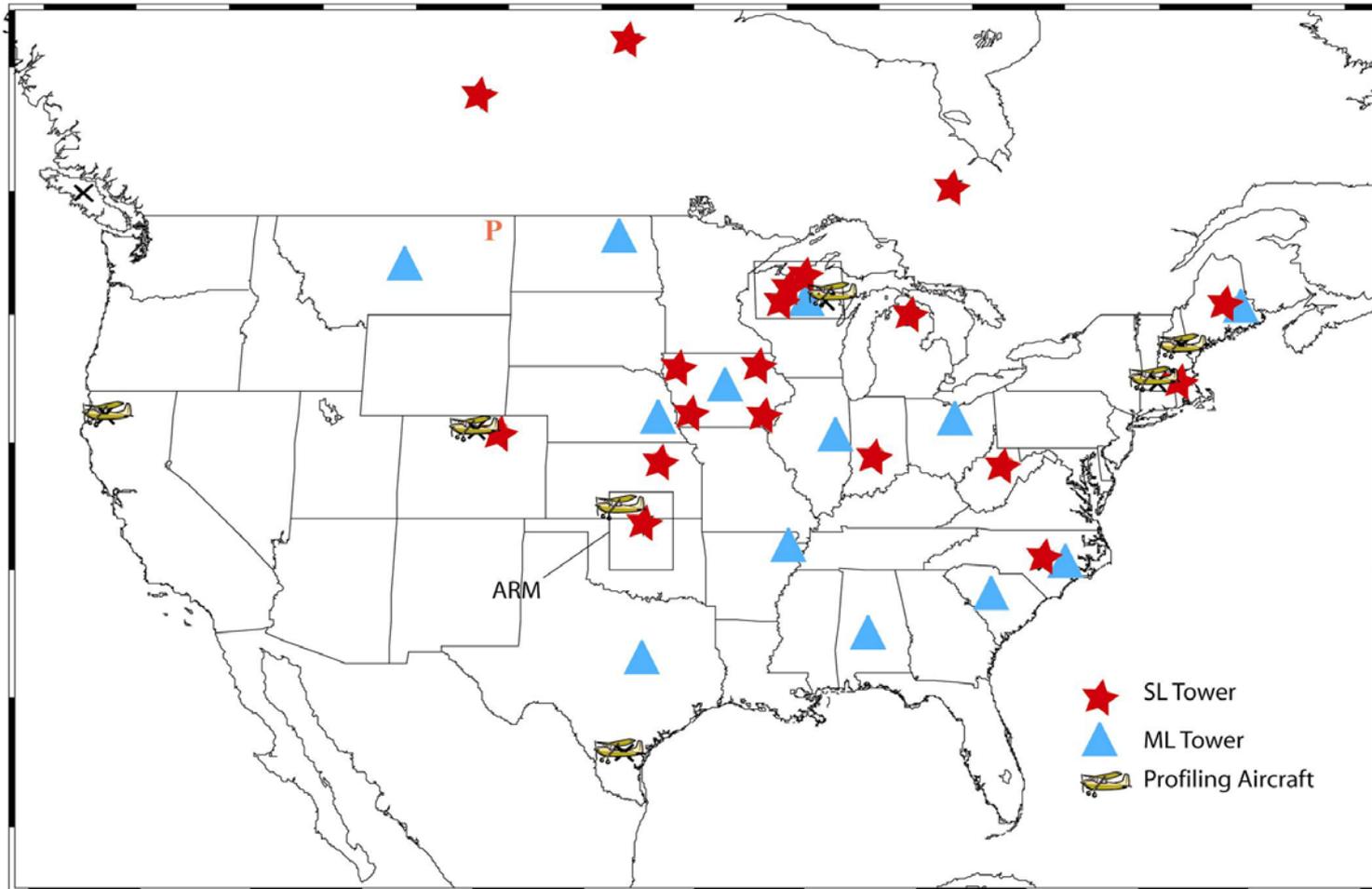


North American Carbon Program

<http://CarbonCycleScience.gov/nacp.pdf>

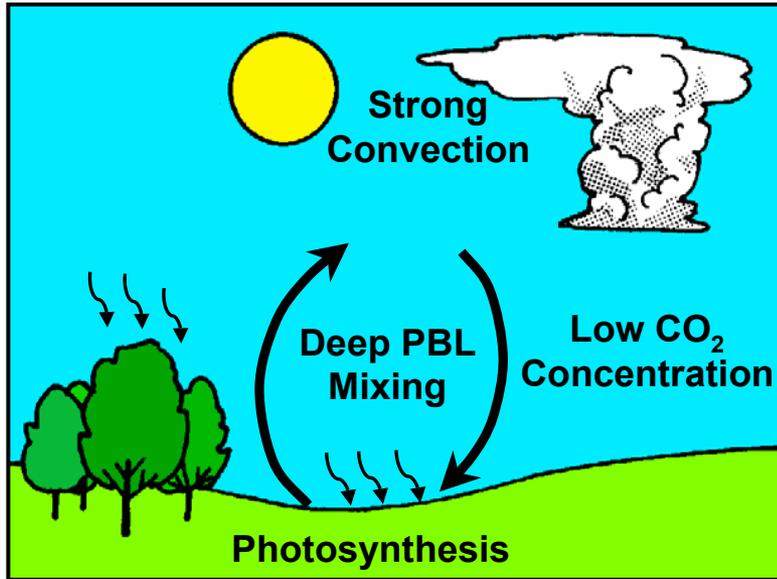


North American in-situ CO_2 Observing System c. 2005

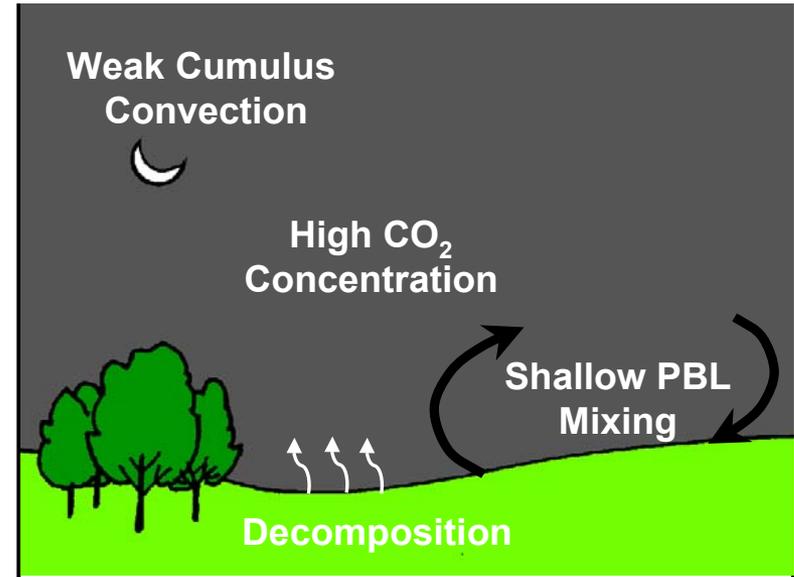


Diurnal Rectifier Forcing

Mid-day



Midnight



Dilution of photosynthesis signal through deep mixing

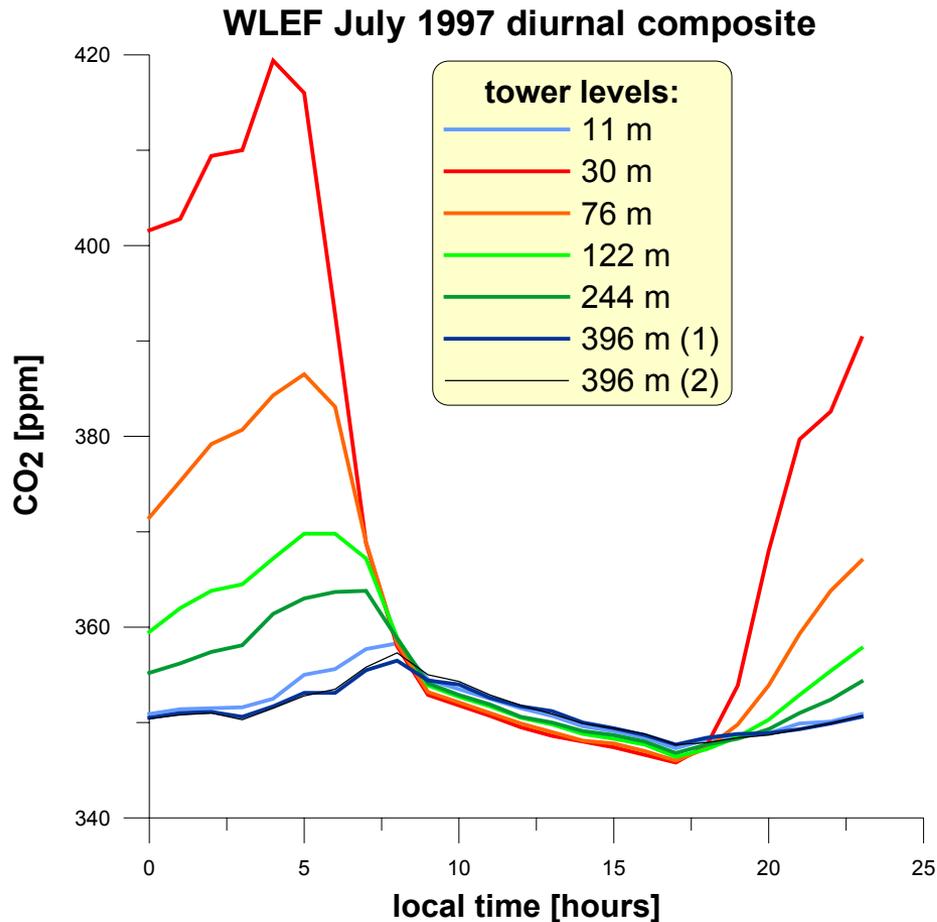
Transport of low-CO₂ air into upper troposphere

Accumulation of respiration signal near the surface

Elevated CO₂ in lower troposphere

Daily mean: Accumulation of CO₂ near the ground, depletion aloft

Diurnal Cycle of CO₂ at WLEF

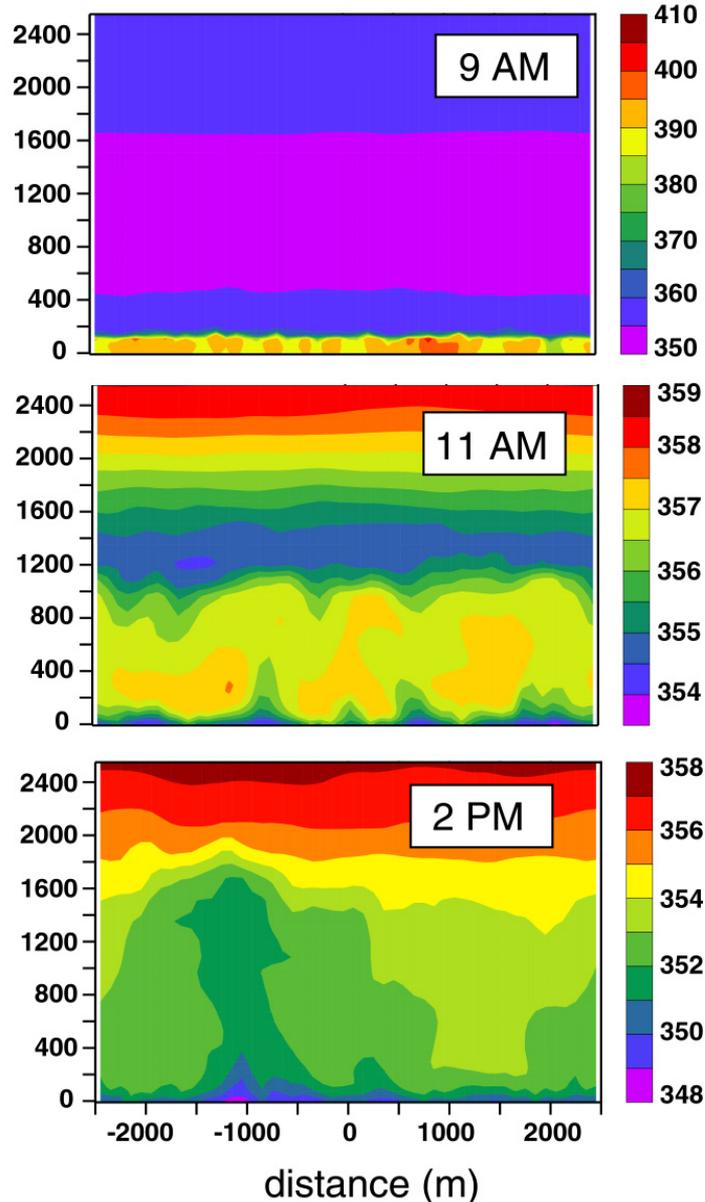


- Diurnal cycle of 70 ppm over an active forest is **5x as strong as seasonal cycle**
- Vertical gradient at sunrise is **15x as strong as pole-to-pole gradient**
- Vertical gradient **reverses** in daytime, much weaker
- Monthly mean **[CO₂]** **decreases upward**, even though forest is a strong sink in July!

Development of a CO_2 "Mixed Layer"

Coupled SiB-RAMS simulation

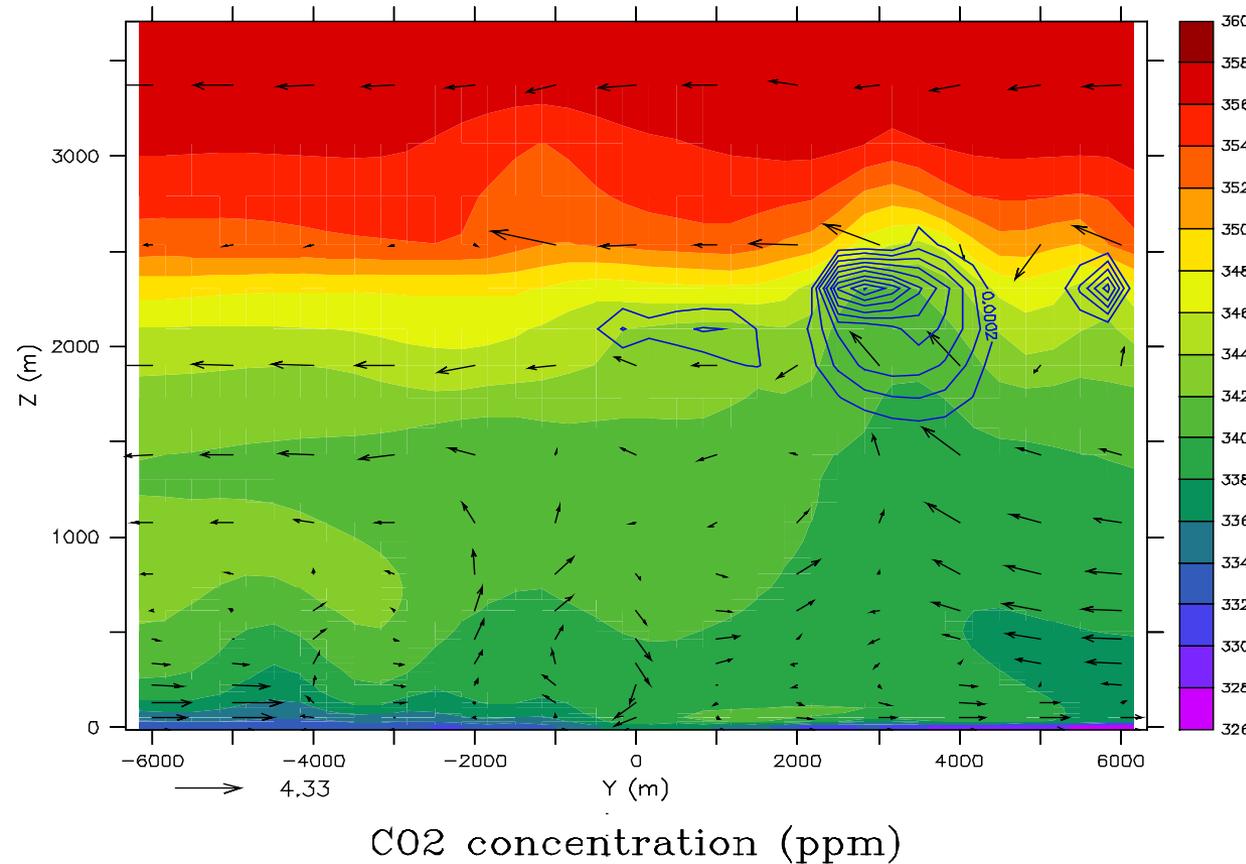
$\Delta x = 100 \text{ m}$, $\Delta z = 20 \text{ m}$



- Nocturnal **respiration** produces extremely high concentrations in morning stable layer
- Surface heating and TKE generation causes **entrainment** of lower- CO_2 air from aloft
- **Photosynthesis** depletes CO_2 in surface layer
- Buoyant **plumes of low- CO_2** air fill the convective boundary layer

Denning et al, 2003

Effects of PBL-top clouds



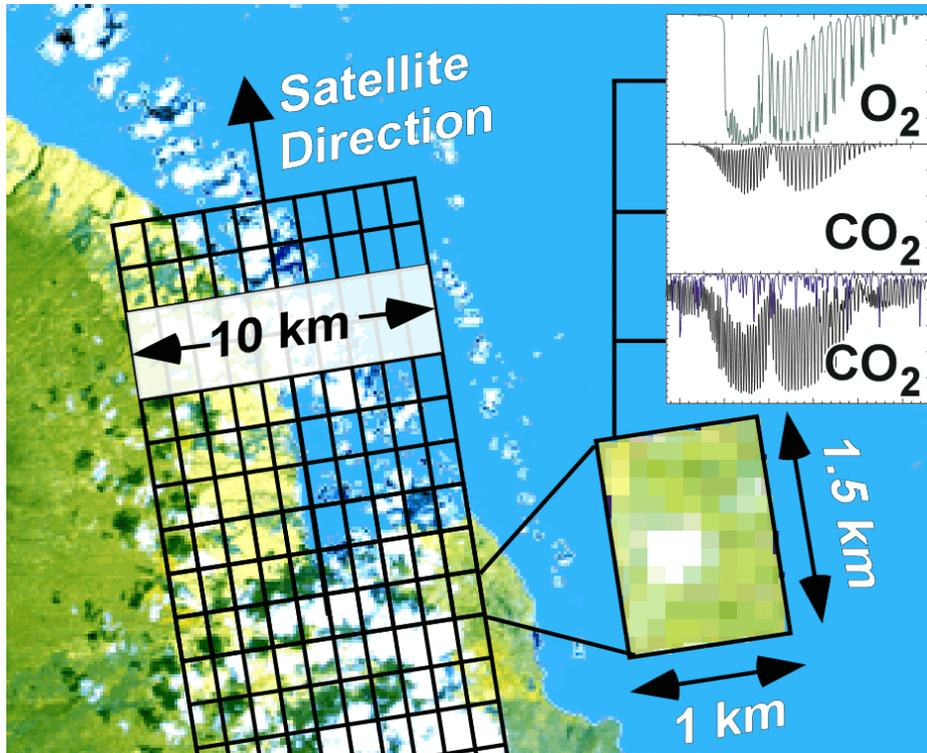
- Thermals carry forest signal to PBL top
- Clouds transports ventilate PBL into free troposphere

Color: CO₂ contours: cloud liquid water vectors: wind

Nicholls et al, 2003

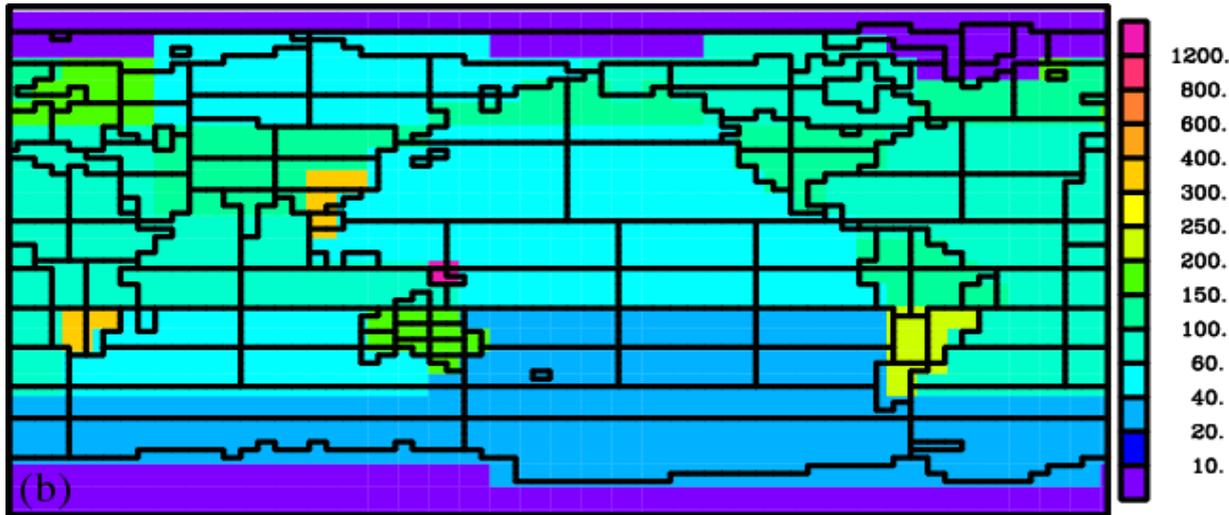
Orbiting Carbon Observatory (OCO)

2-year ESSP mission scheduled to launch in **2007**



- Three bore-sighted grating spectrometers to estimate column CO₂ and O₂ (~1.6 ppm)
- Sun-synchronous, 13:30 ECT (A-train)
- 1x1.5 km IFOV to "see between clouds," 10 pixel swath
- Spatially dense CO₂ in a bright sunny world

Potential Satellite CO₂ Inversion



RMS of monthly
uncertainty in
flux retrieval
(g C m⁻² yr⁻¹)

- Pseudodata inversion of passive NIR retrieval
 - 8 km cloud mask (overly pessimistic)
 - 1.8 ppm uncertainty on each of 234,000 measurements
 - Invert hourly means, calculate flux uncertainties
- Result: ~ 80-150 gC m⁻² yr⁻¹ over most continents
- Equivalent to ~ 1 μMol m⁻² s⁻¹ uncertainty in regional daytime photosynthesis ... **powerful constraint on process models of carbon exchange!**

Possible Sources of Bias in New Obs

Surface carbon exchange (biology) covaries with meteorology on many time scales!

- Diurnal cycle
- Seasonal cycle
- Cloud/clearsky bias

Unresolved atmospheric transport processes may significantly affect [CO₂] mixing ratio

- PBL entrainment and diurnal pumping
- Cumulus-scale updrafts and downdrafts
- Frontal lifting

Advantages of SP for CO₂ Inversions?

- Archive grid-scale turbulent and convective mass fluxes from CSRMs
- Use archived winds and mass fluxes to drive very simple offline transport model to calculate Green's functions
- Simple advection/convection model has no IF-THEN-ELSE constructs ... self-adjoint!
- Excellent framework for fine-scale 4DVAR of carbon fluxes on model grid and time step, if observations are available

Summary (1)

- Interactions between climate and the carbon cycle are **among the most important contributors to uncertainty in future climate** (one of 3 highest priorities of CCRI)
- Atmospheric [CO_2] variations are an important **source of information about underlying source/sink processes**
- Tracer transport inversions to date have been strongly **data-limited, but this is about to change dramatically!**
- New sources of in-situ and remotely sensed data can potentially **revolutionize the study of the carbon cycle**

Summary (2)

- By 2007, we will be swimming in hourly and daily observations of atmospheric carbon
- Quantitative interpretation of the new data will be critically dependent on correct representation of
 - Vertical structure of transport by turbulence and moist convection
 - Diurnal and seasonal variations of these transports
- The research being considered by the proposed STC could make a huge contribution to Earth System science, way beyond clouds and the hydrologic cycle!

Earth System Data Assimilation

Carbon Cycle Science Fiction?

- **Coupled predictions** of weather, photosynthesis, transpiration, decomposition, air-sea gas exchange, wind-driven currents, thermohaline circulation, nutrients
- Develop a **generalized cost function** that measures the error in these predictions
 - T, q, u, clouds, ocean color, SST, currents, FPAR, veg spectral properties, tower fluxes, biomass, soil moisture, [CO₂], stable isotopes
- Optimize model **state and parameters** according to **partial derivatives** of cost function with respect to each observable
- "Memory" of **slow processes helps constrain solution**