

# What can we learn from intensive in-situ airborne observations of CO<sub>2</sub> over the continent?

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and Steven C. Wofsy

# OUTLINE

## I. Observations and variability of CO<sub>2</sub> at various scales

-unique feature of **intensive aircraft** sampling: could probe CO<sub>2</sub> structure in the vertical and the horizontal at multiple scales

## II. A tool to model atmospheric transport and reveal footprint of atmospheric observations

## III. What airborne observations + transport tool can tell us

## IV. Conclusions

# COBRA

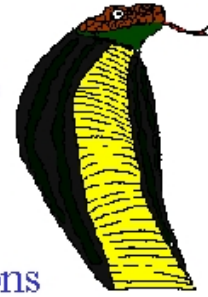
## (CO<sub>2</sub> Budget and Rectification Airborne Study)

**Regional intensives:**

- Regional flux estimates in the vicinity of flux towers
- Lagrangian framework

**Large scale surveys:**

- Large scale tracer distributions (CO<sub>2</sub>, CO, H<sub>2</sub>O, isotopes)
- Lagrangian analysis



### Participants:

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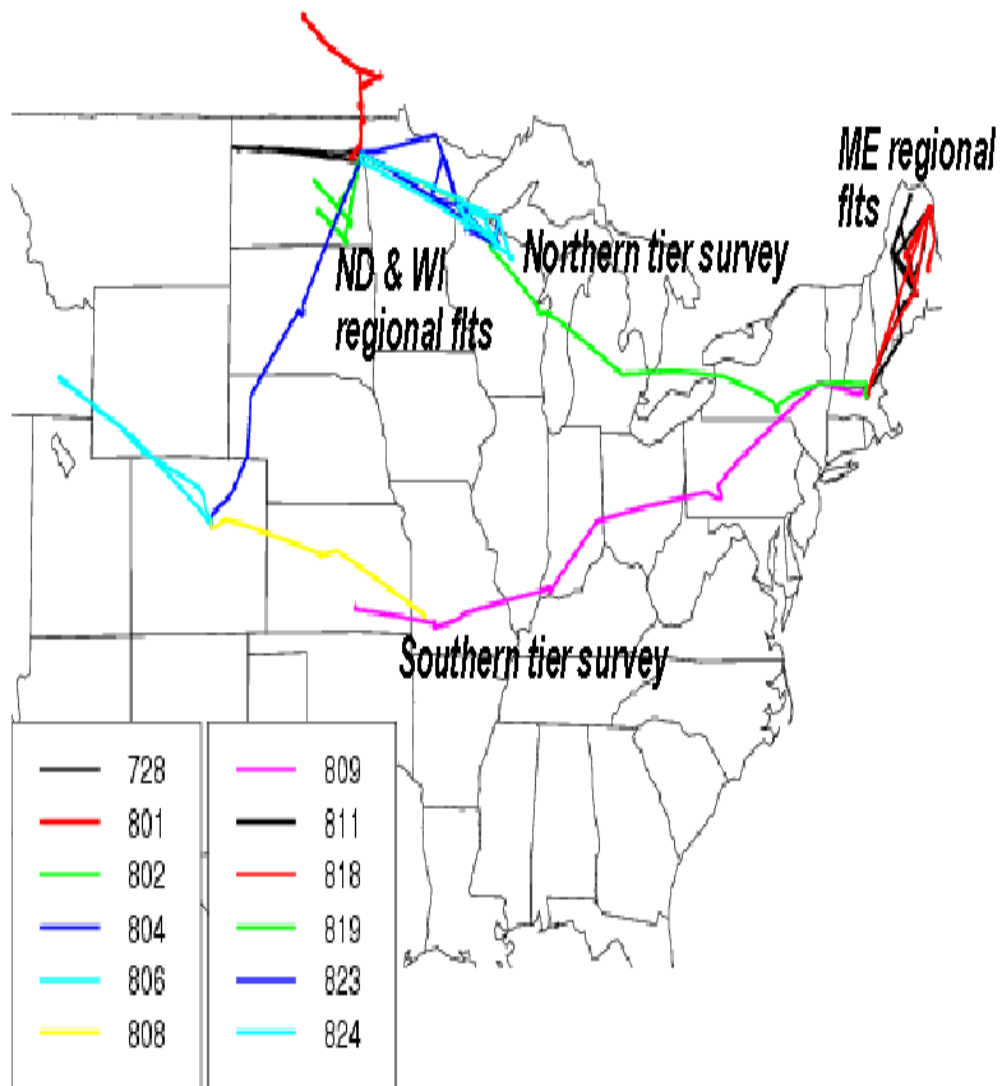
Pieter Tans and Peter S. Bakwin:  
(*Climate Monitoring and Diagnostic Laboratory, NOAA*)

Ken J. Davis:  
(*Department of Soil, Water, and Climate, University of Minnesota, now: Department of Meteorology, Pennsylvania State University*)

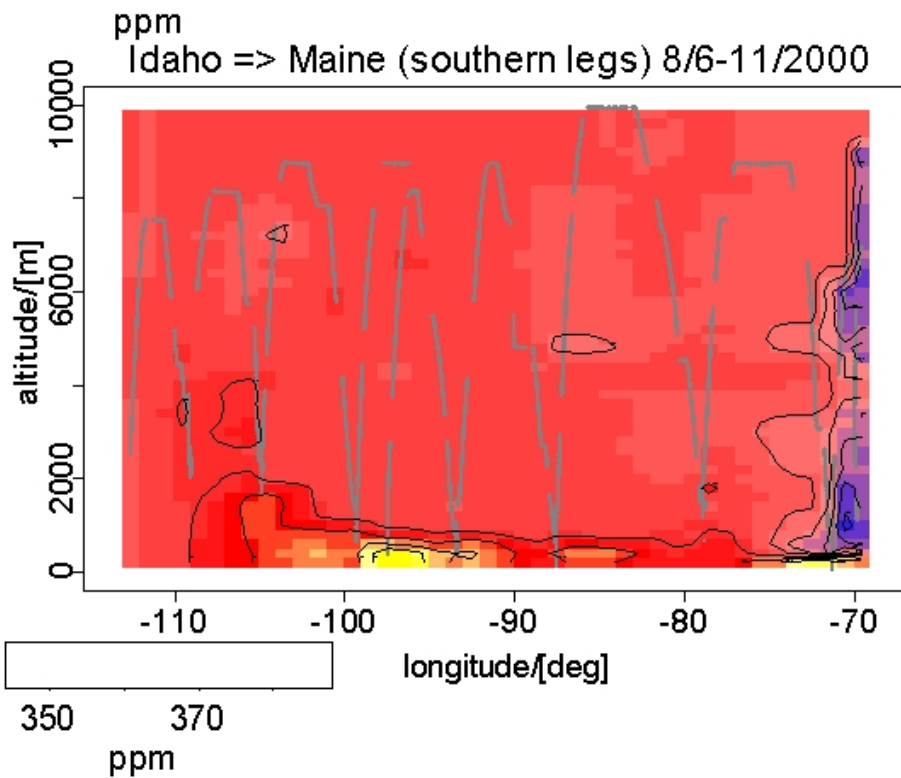
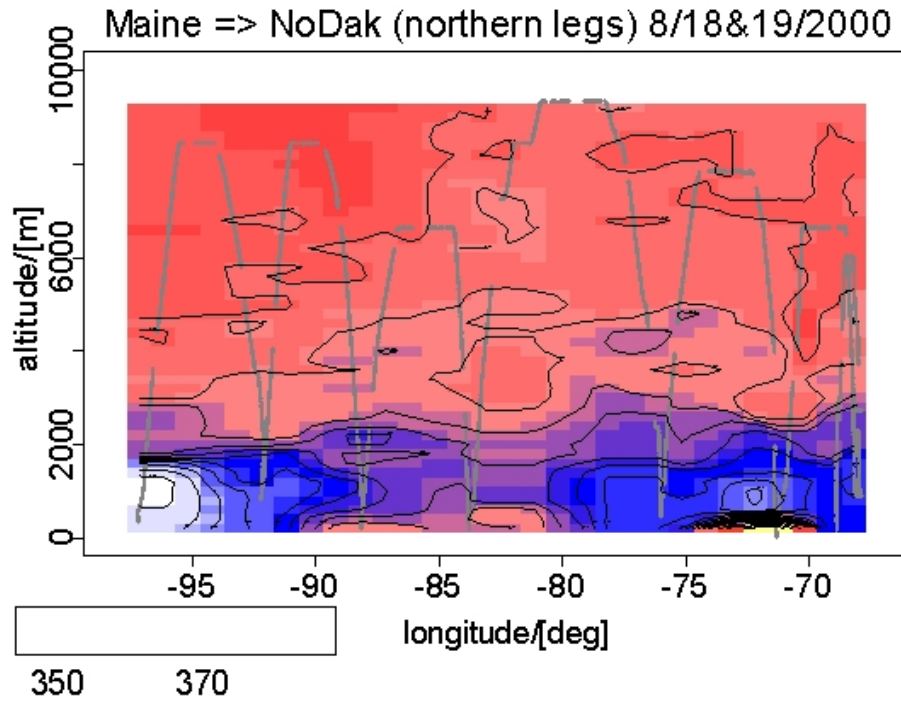
Scott Denning, Marek Uliasz:  
(*CSU*)

Supported by: NOAA, NASA, NSF, and DoE

# COBRA 2000 Flight Tracks

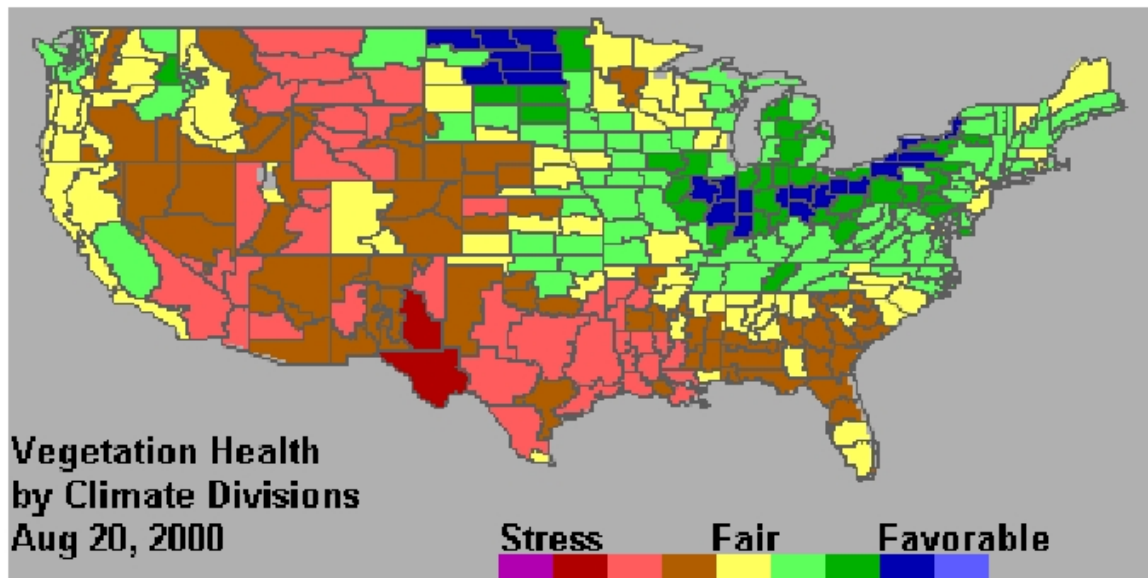


# COBRA: Large scale CO<sub>2</sub> distribution



# Vegetation Health Index

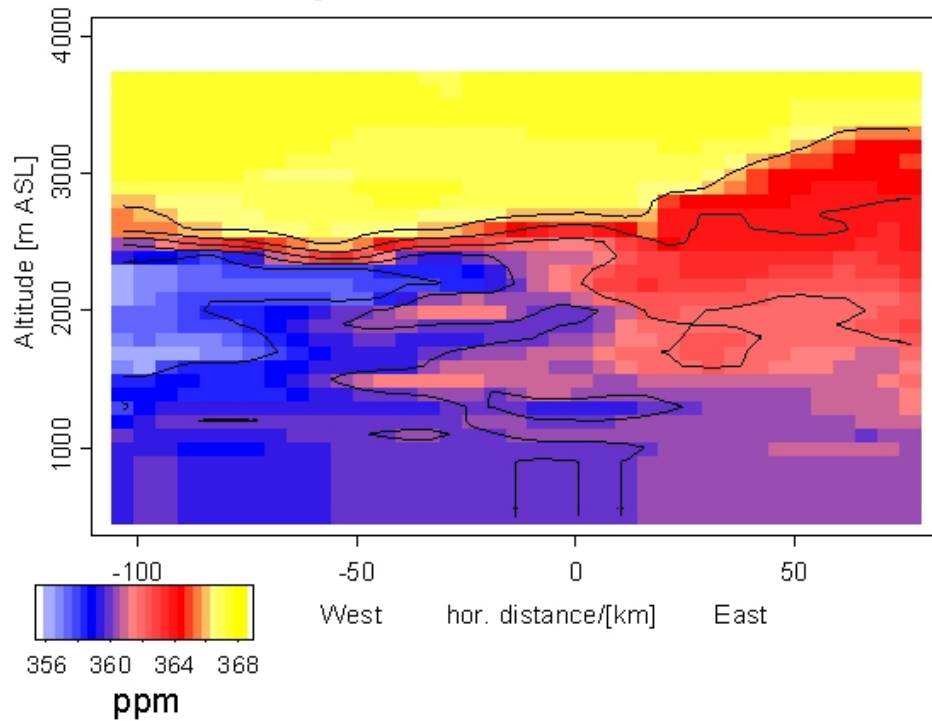
*(NOAA National Environmental Satellite,  
Data, and Information Service)*



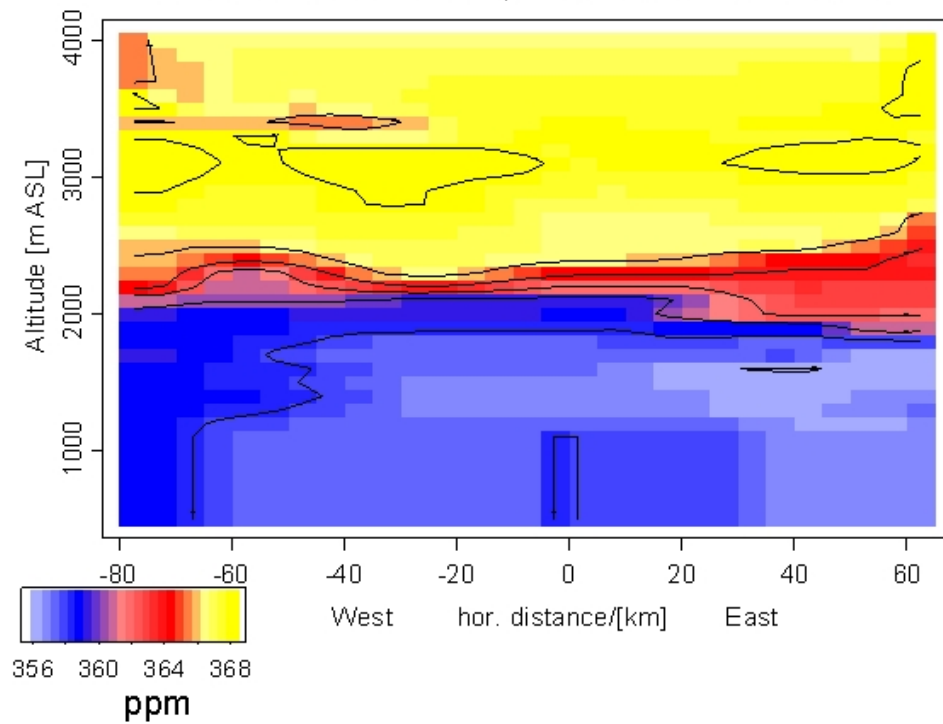
<http://orbit-net.nesdis.noaa.gov/crad/sat/surf/vci/uscd/usacd.html>

# CO<sub>2</sub> cross-sections through air mass

CO<sub>2</sub>: Morning of 8/2/2000, Cross-section in Southern ND

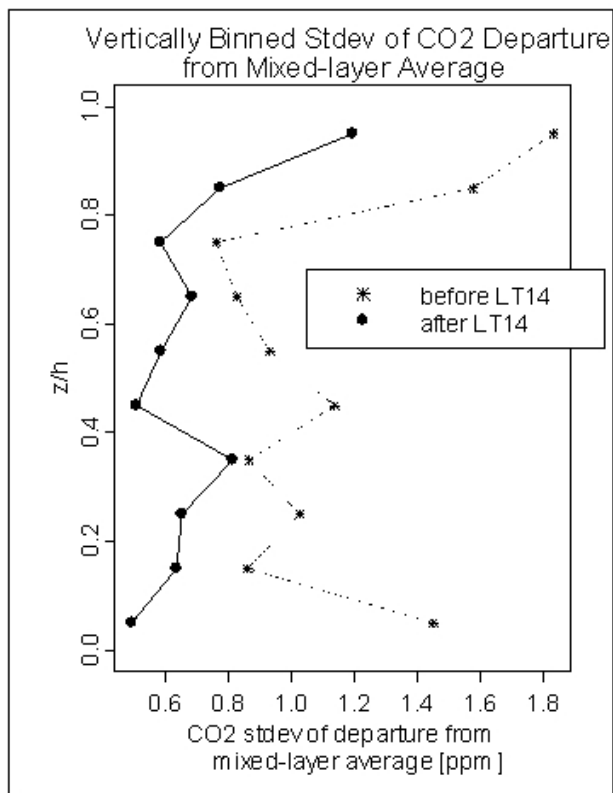
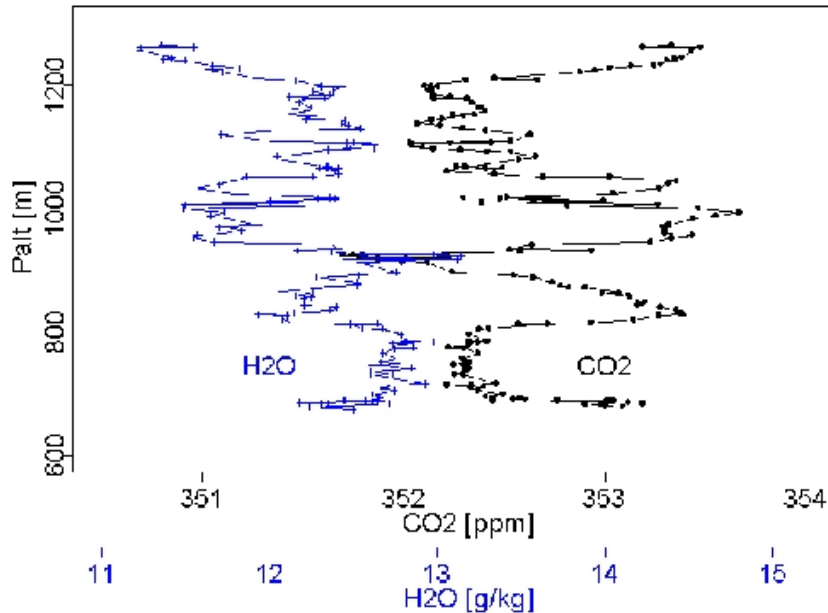


CO<sub>2</sub>: Afternoon of 8/2/2000, Cross-section in Southern ND



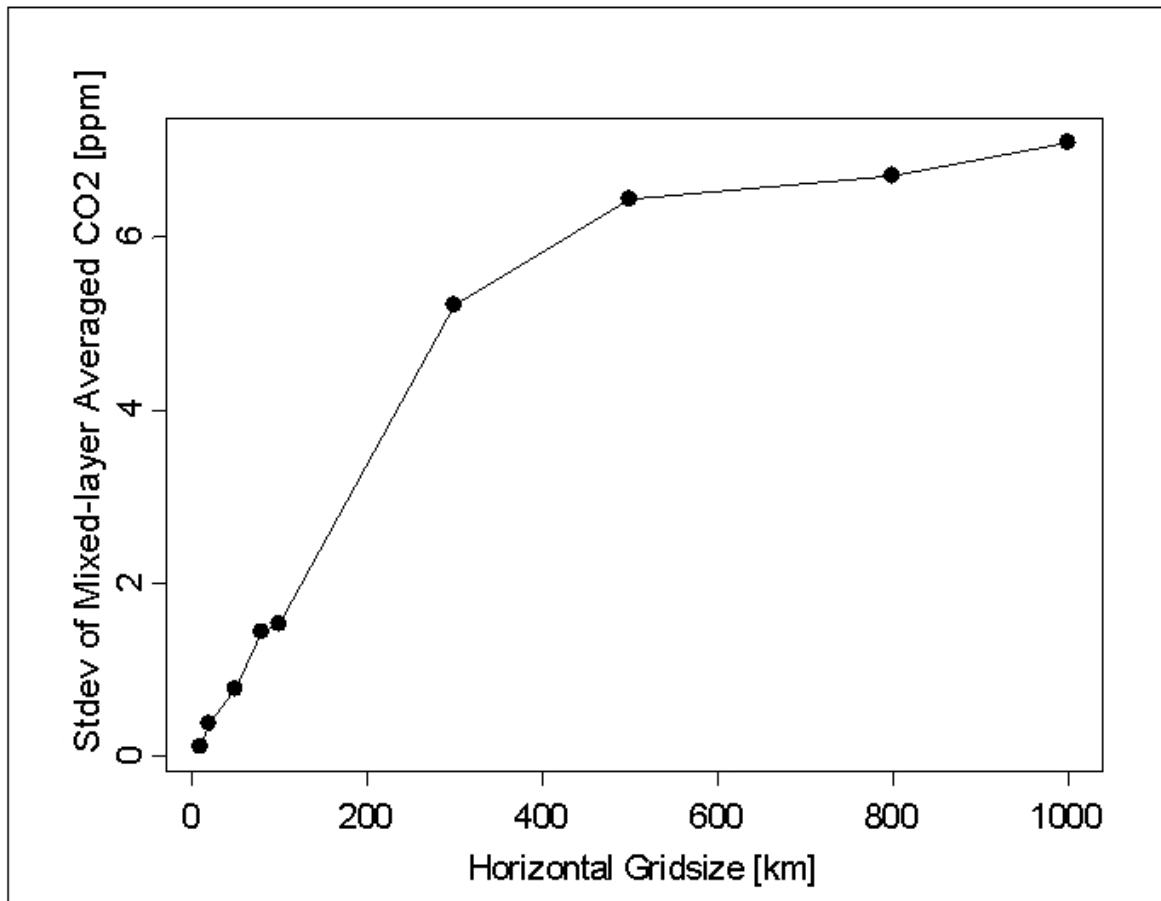
# Fluctuations in Tracer Concentrations due to Turbulent Eddies

WLEF vertical profiles 23 Aug. 2000, midday



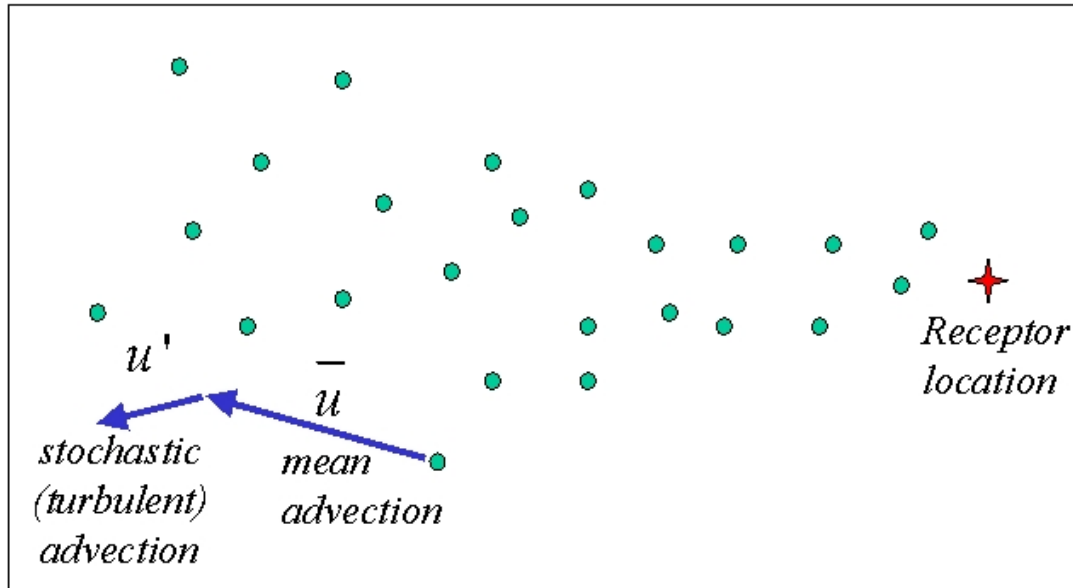


## Subgrid-scale Variability of Mixed-layer Averaged CO<sub>2</sub>



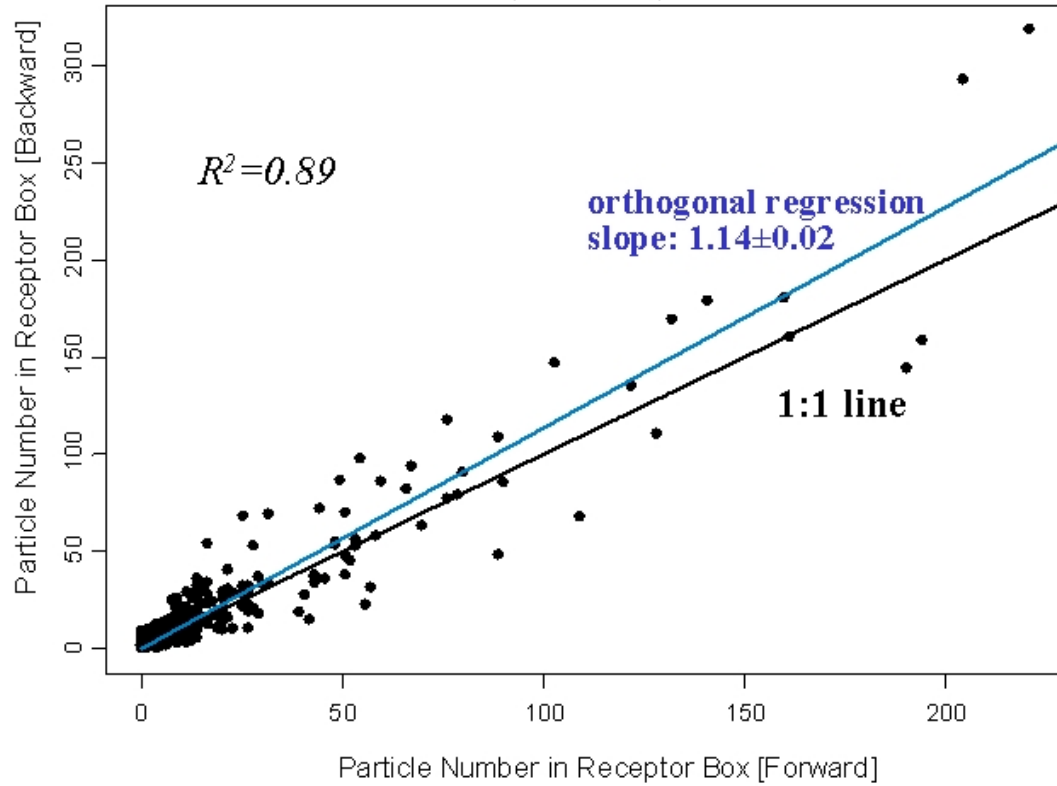
# STILT

## Stochastic Time Inverted Lagrangian Transport Model

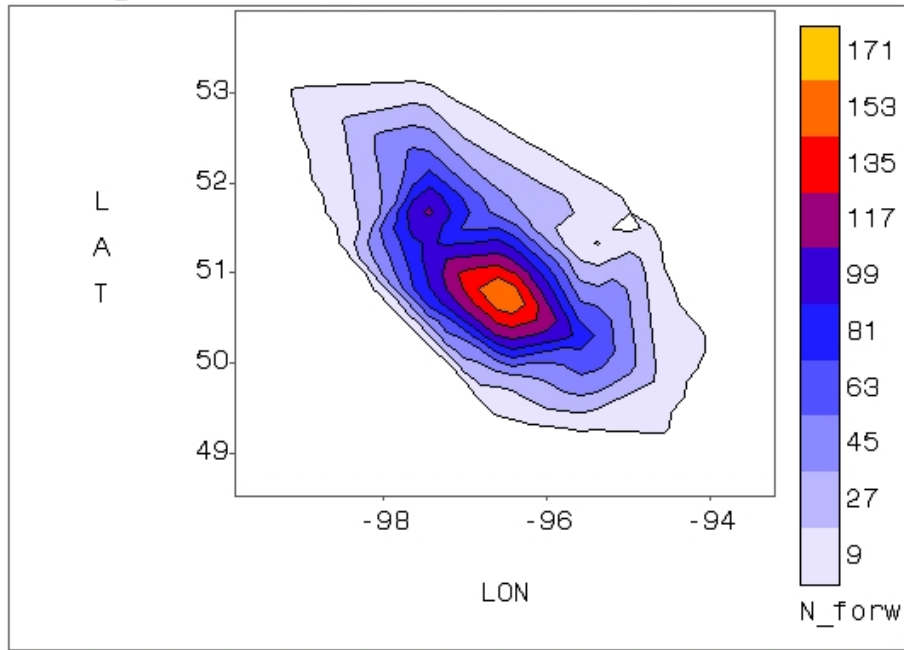


- Based on HYSPLIT (Hybrid Single Particle Lagrangian Integrated Trajectory) model code [*Draxler and Hess, 1998*]
- Driven by ETA, AVN (forecasts) or EDAS, FNL (assimilations)
- Improved turbulence parameterization
  - $T_{Lw}$  (vertical) and  $\sigma_w$  after *Hanna* [1982]
  - reflection/transmission scheme at interfaces between high and low turbulence after *Thomson* [1997]
- Time Inverted/Receptor oriented (what is the footprint of a measurement at the aircraft (receptor location)?)

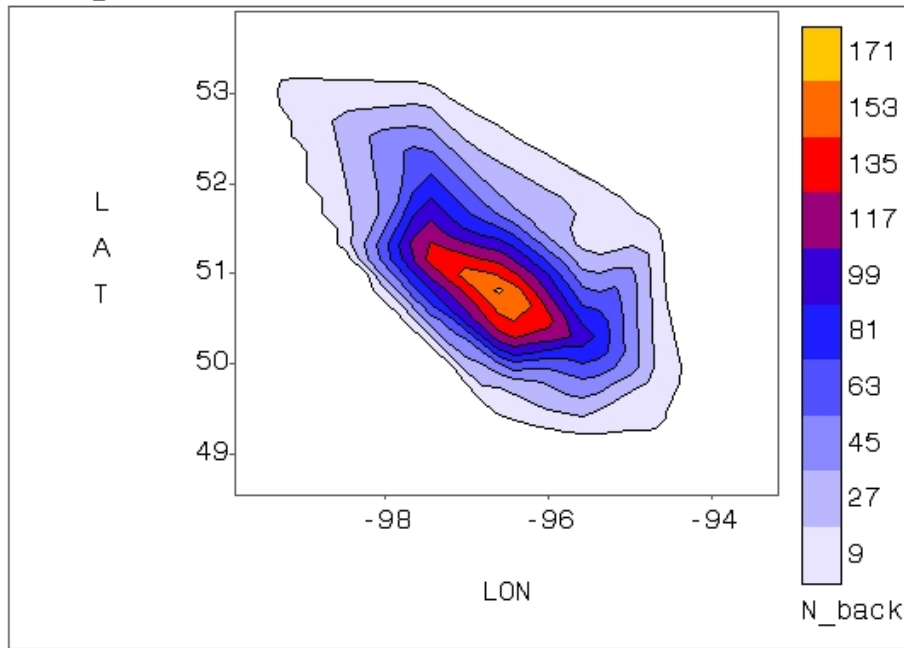
### Time-Backward vs Forward Particle Run Results (48 hours)



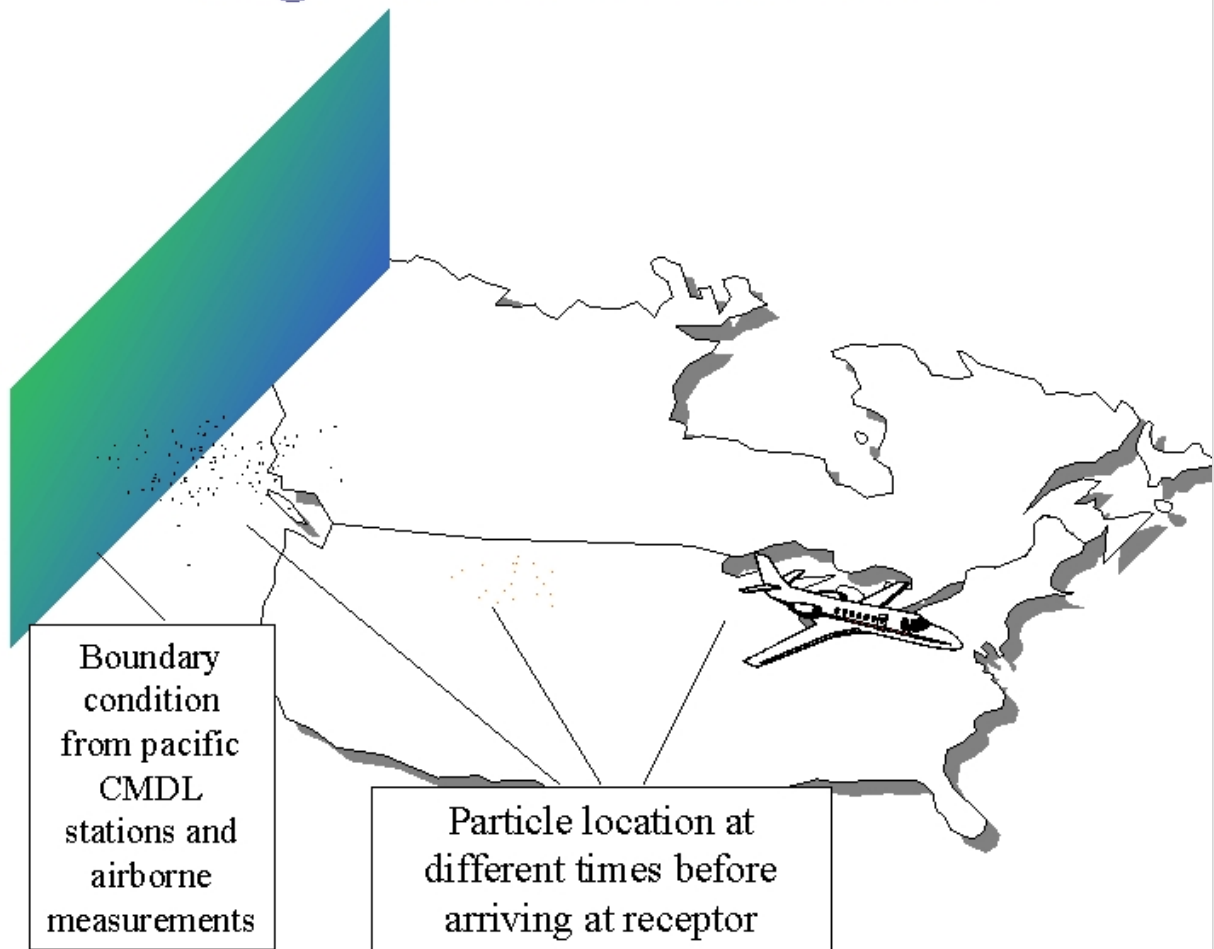
## Footprint at -48 h, forward STILT run



## Footprint at -48 h, backward STILT run



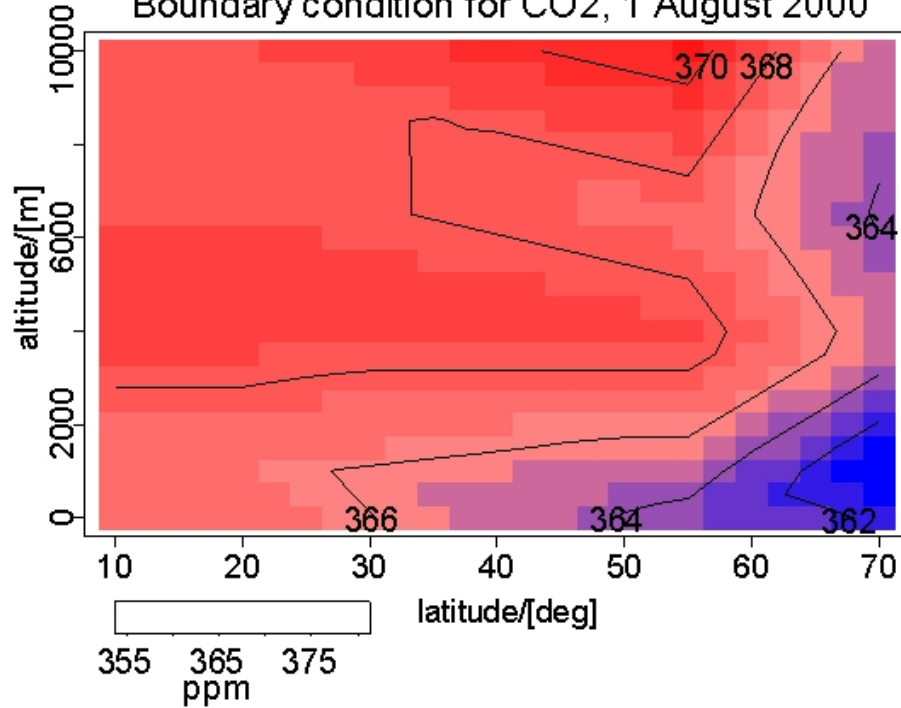
# STILT-model analysis of large scale tracer distribution



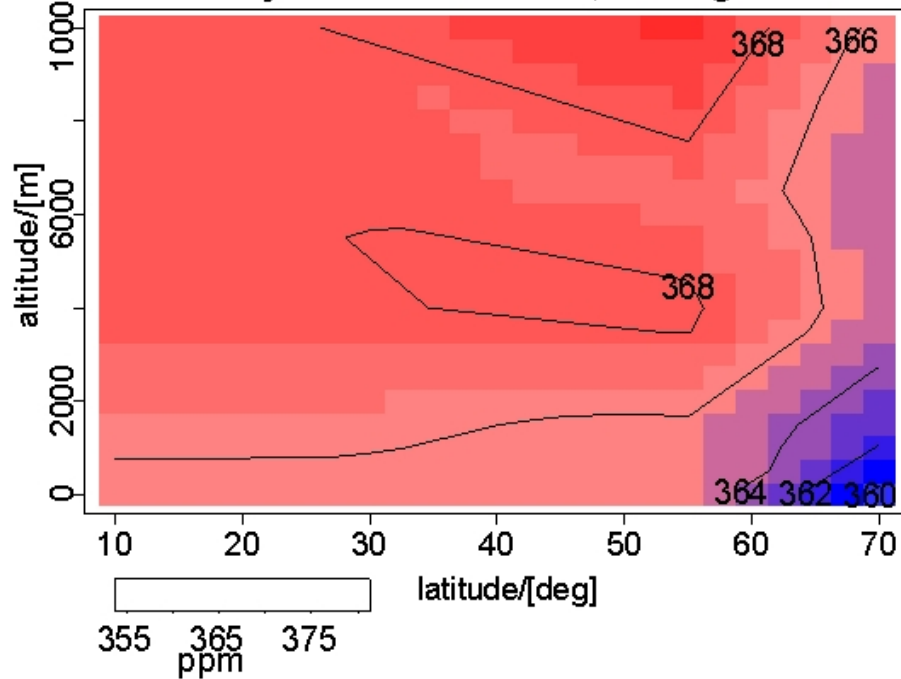
- 100 particles per receptor point (aircraft position along the survey) followed for 15 days back
- particles represent “little air masses” with equal mass
- particles “sample” surface fluxes below  $0.5 * \text{mixed layer height}$
- particles get initial concentration at boundary

STILT boundary condition:  
climatology of pacific ground based and airborne data

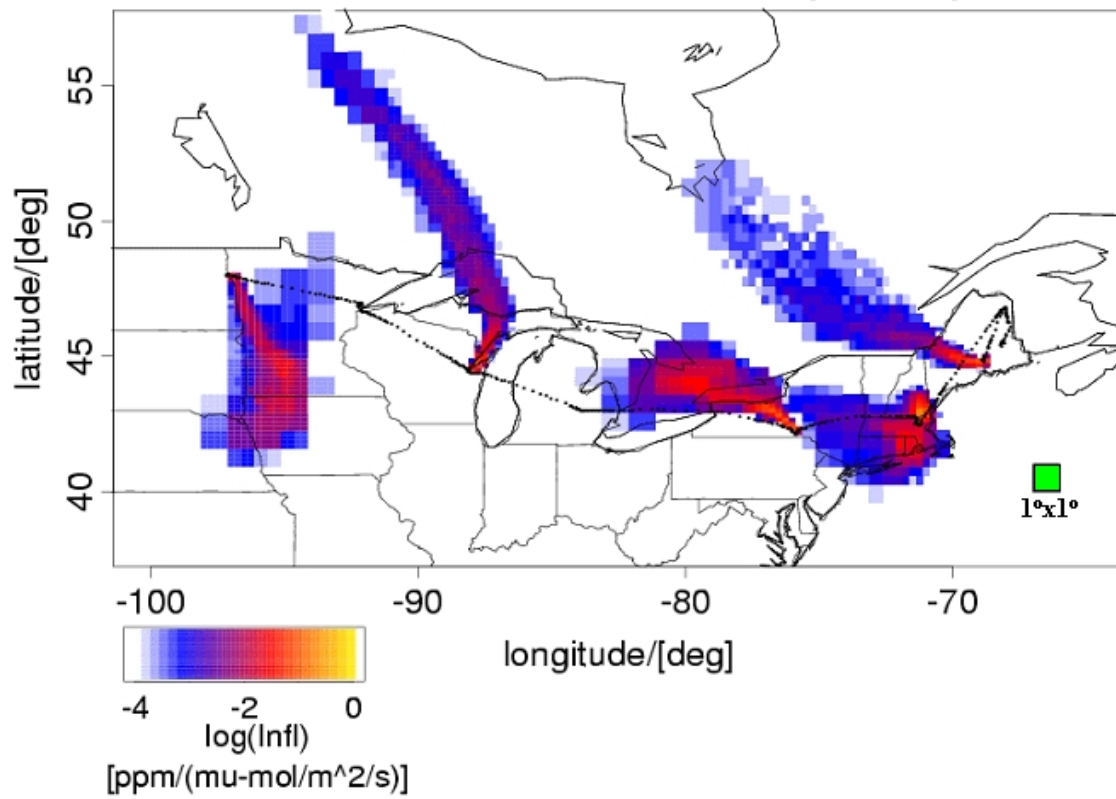
Boundary condition for CO<sub>2</sub>, 1 August 2000



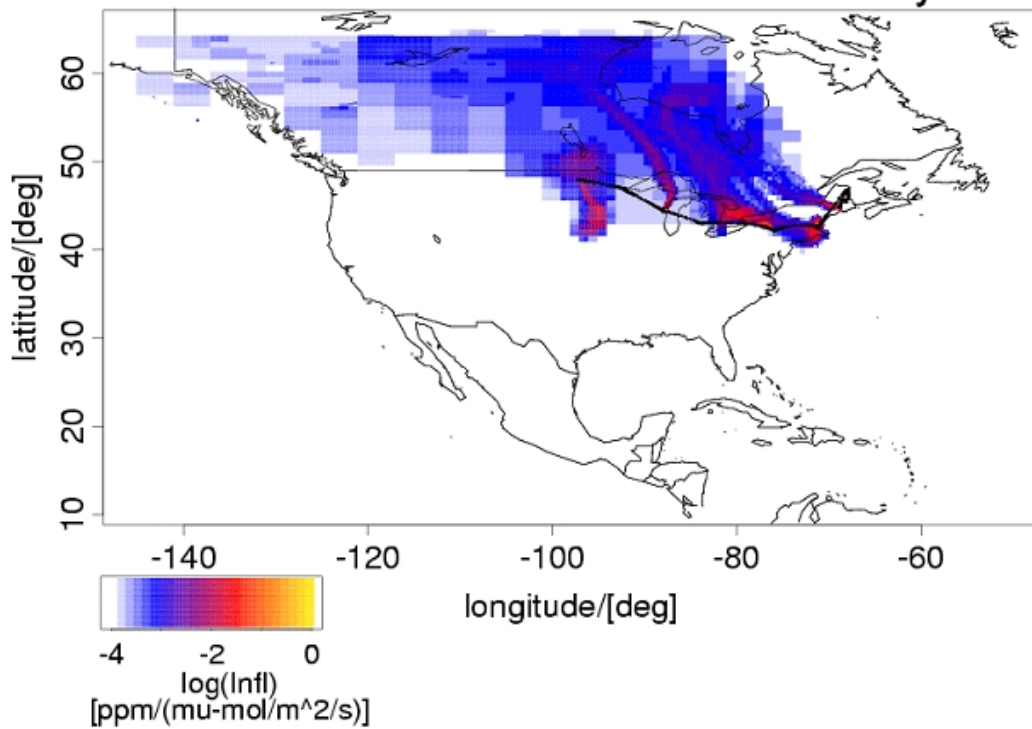
Boundary condition for CO<sub>2</sub>, 20 August 2000



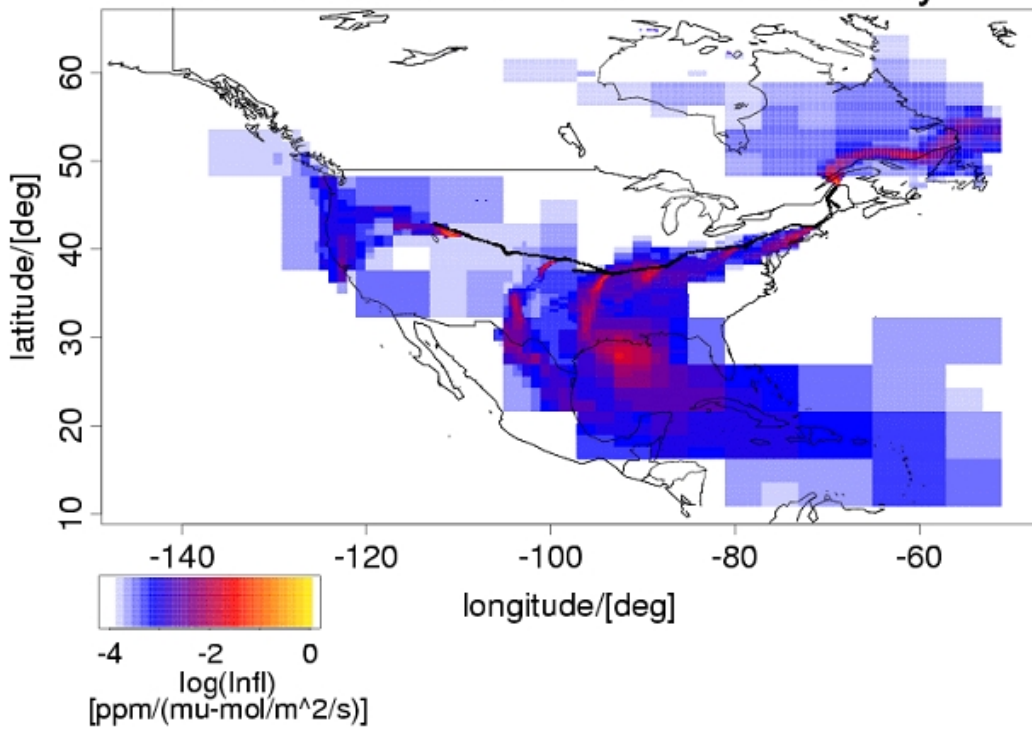
### Surface influence northern survey, 2 days back



## Surface influence northern survey

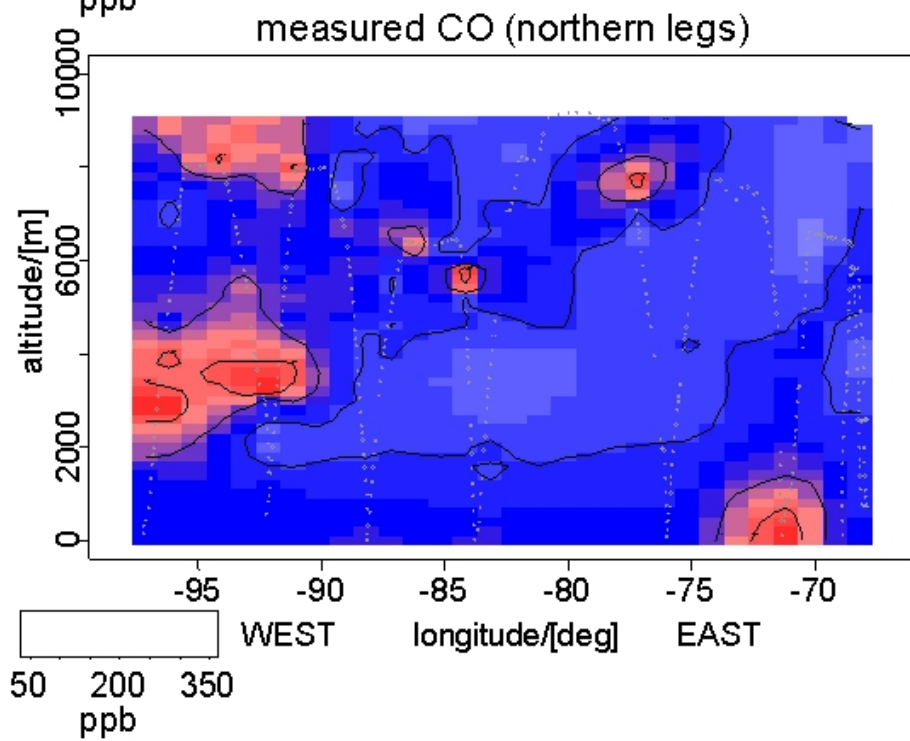
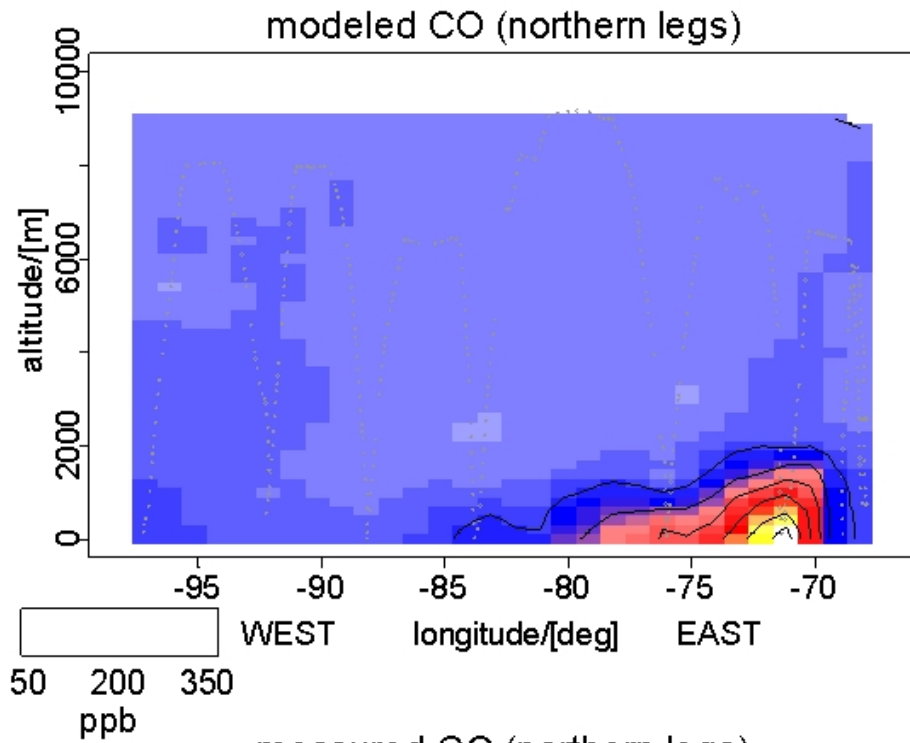


## Surface influence southern survey

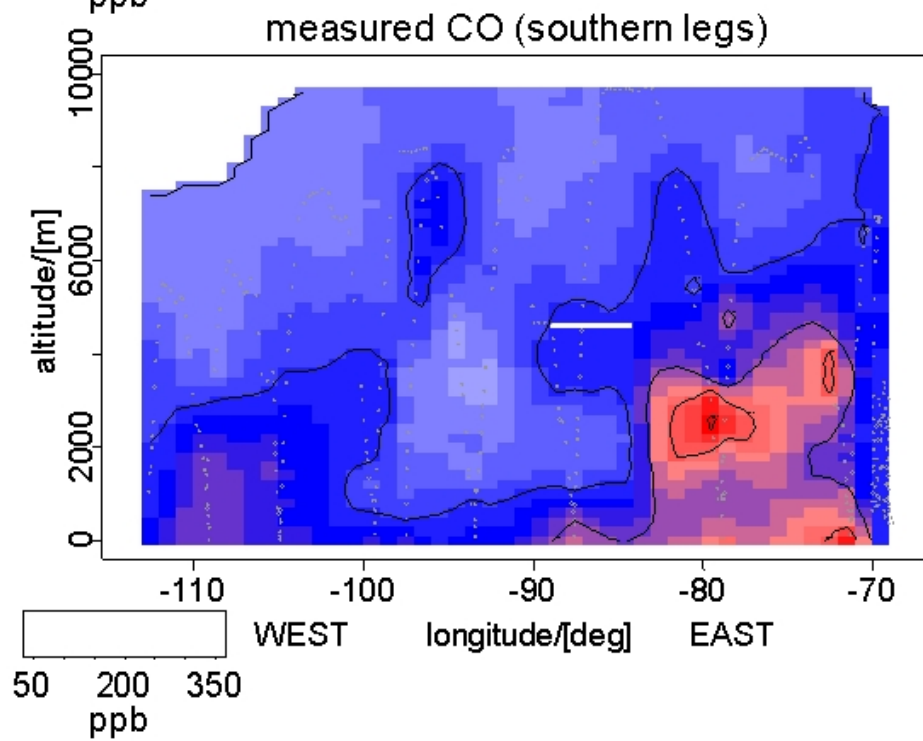
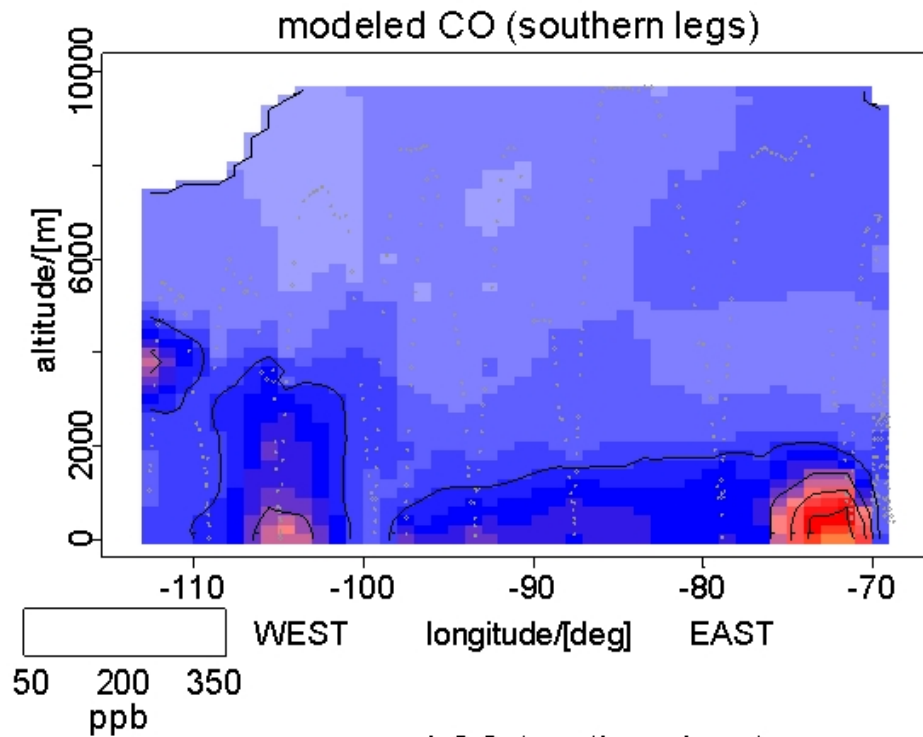




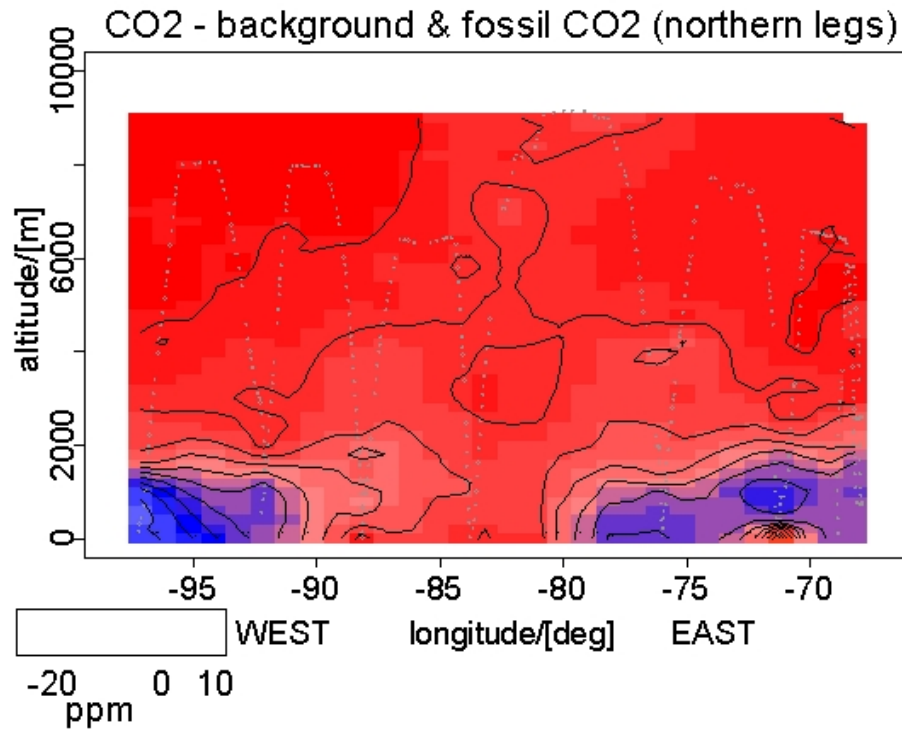
# STILT results, COBRA northern survey



# STILT results, COBRA southern survey



## CO<sub>2</sub> vegetation signal, northern survey

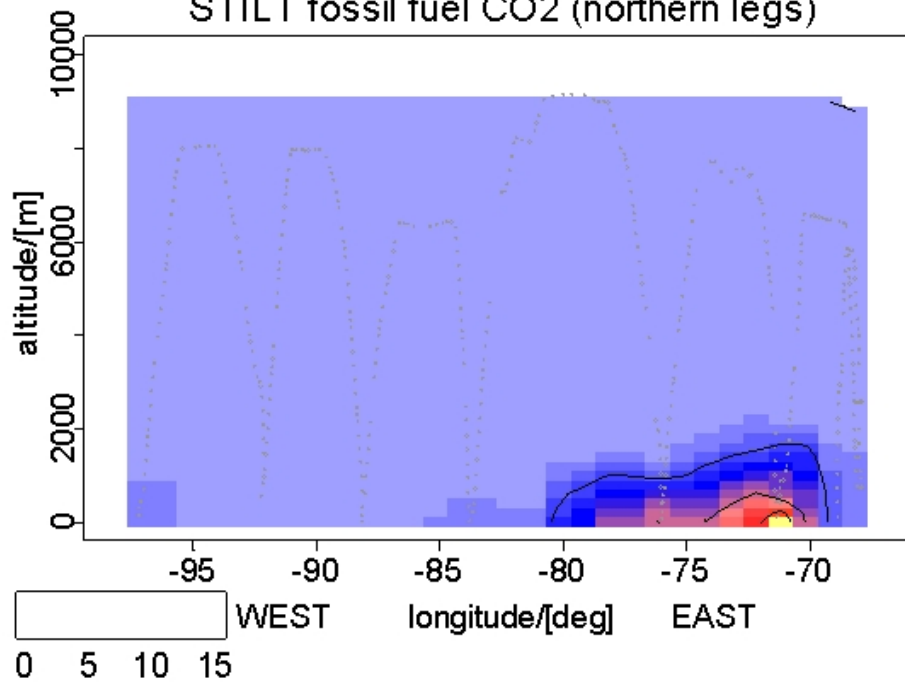


$$CO_{2,veg}(\text{meas.}) = CO_2(\text{meas.}) - CO_2(\text{foss.}) - CO_2(\text{ini.})$$

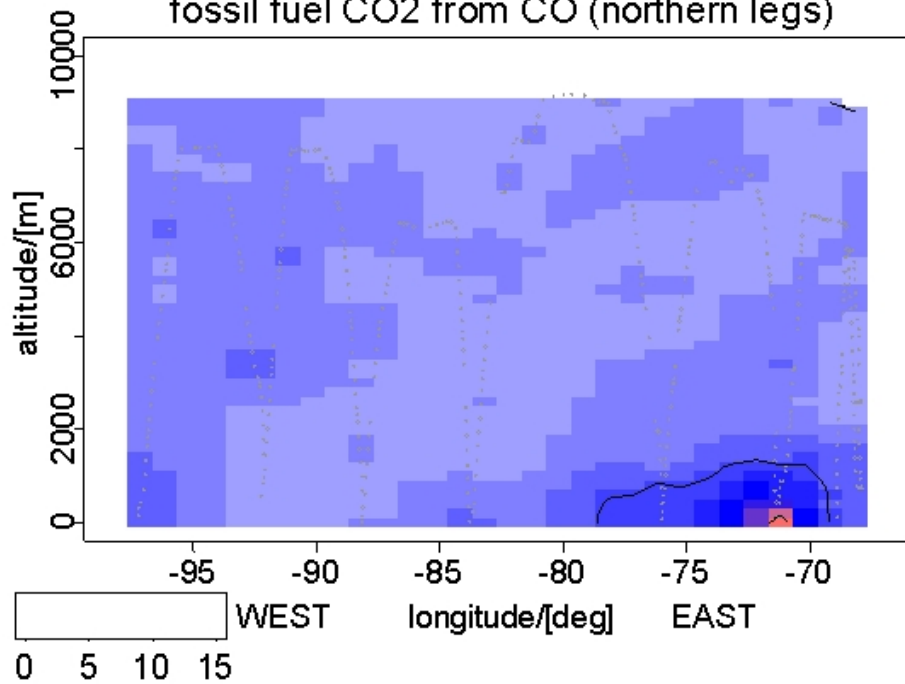
$$CO_2(\text{foss.}) = \left[ CO(\text{meas.}) - CO(\text{ini.}) \right] \cdot \frac{CO_2(\text{emission})}{CO(\text{emission})}$$

# CO2 fossil fuel signal, northern survey

STILT fossil fuel CO2 (northern legs)



fossil fuel CO2 from CO (northern legs)



## STILT inversion

Net ecosystem exchange for vegetation  $i$ :

First guess from Fluxnet:

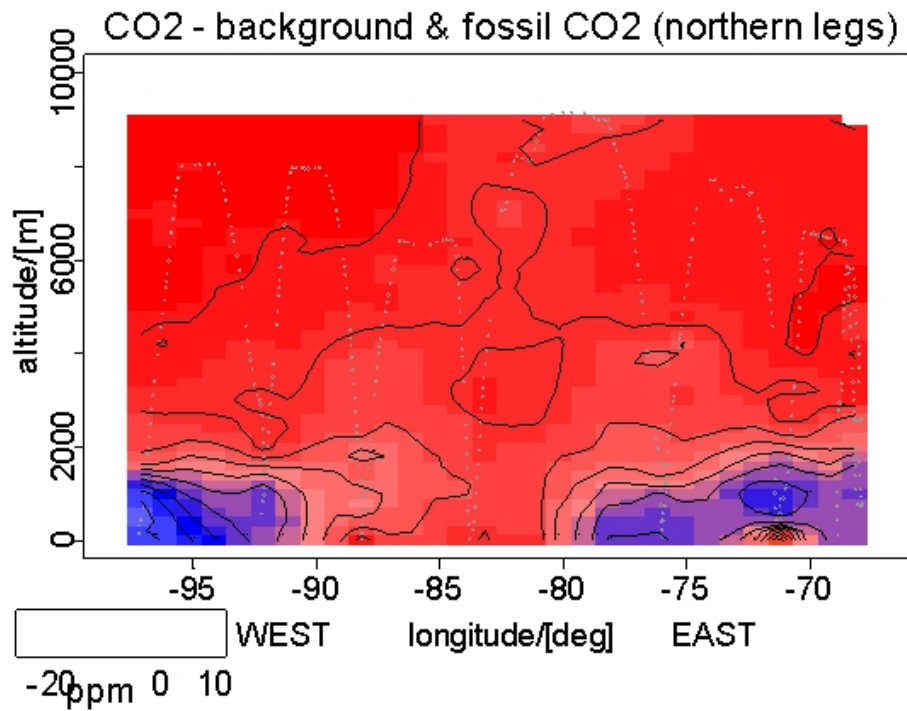
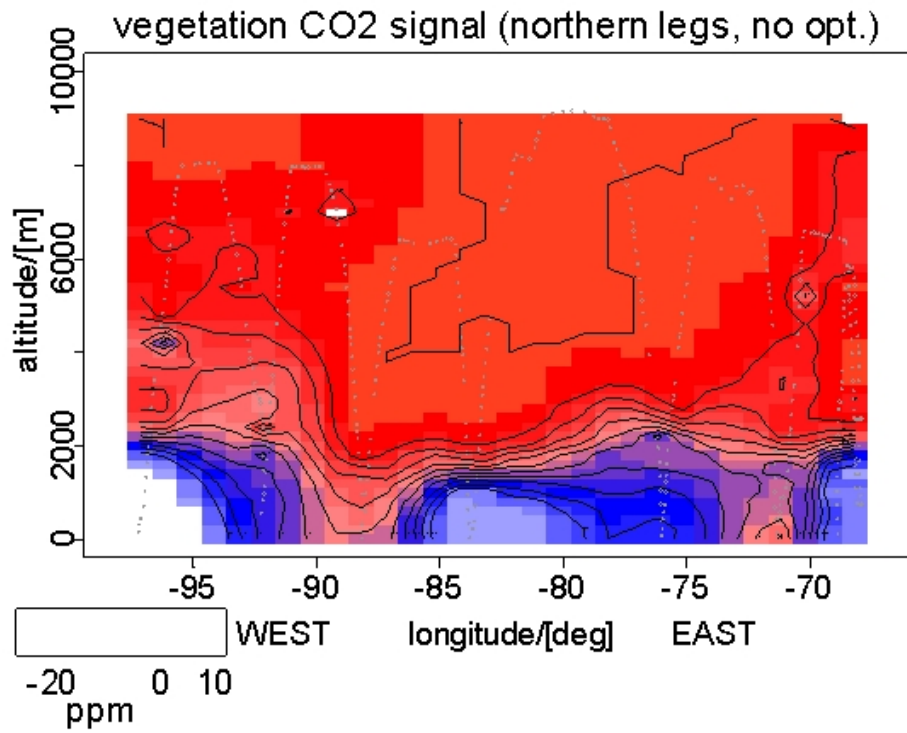
$$\begin{aligned} NEE_i &= \frac{\partial R_i}{\partial T} \cdot T + \frac{a_i \cdot PAR}{b_i + PAR} \\ &= \text{Respiration} + \text{GEE} \end{aligned}$$

PAR: photosynthetically active radiation

$a_i/b_i$ : quantum efficiency

$b_i$ : max. GEE

# STILT results using NEE from Fluxnet: North



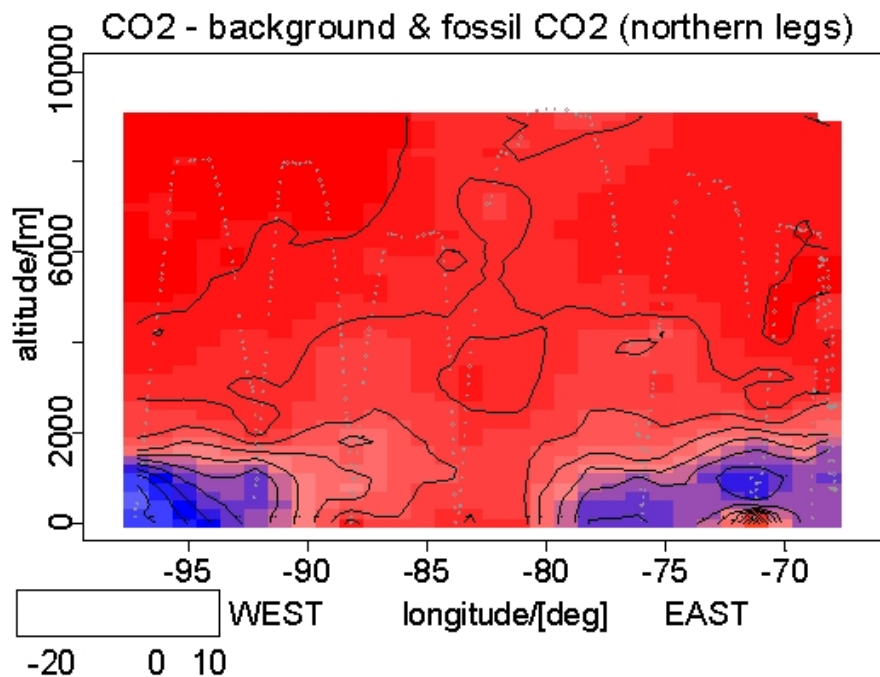
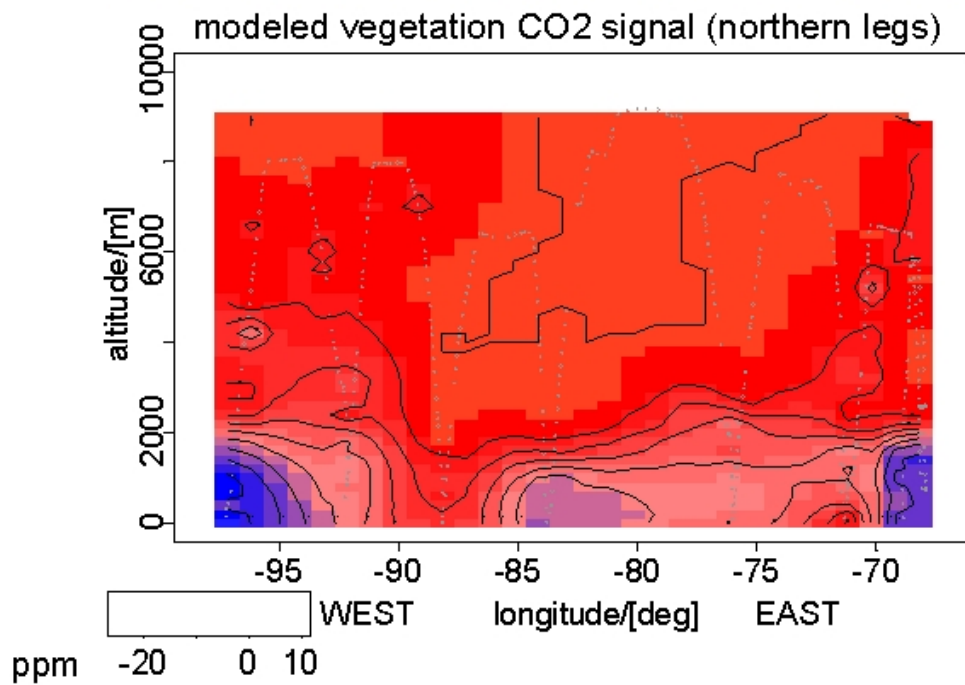
### Inversion:

$$NEE_i = \lambda_i \cdot \left( R_i + \frac{a_i \cdot PAR}{b_i + PAR} \right)$$

$\lambda_i$  optimized so that

$$\sum_{r=\text{receptors}} \left( CO_{2,\text{veg},r}(\text{model}) - CO_{2,\text{veg},r}(\text{meas.}) \right)^2 = \min$$

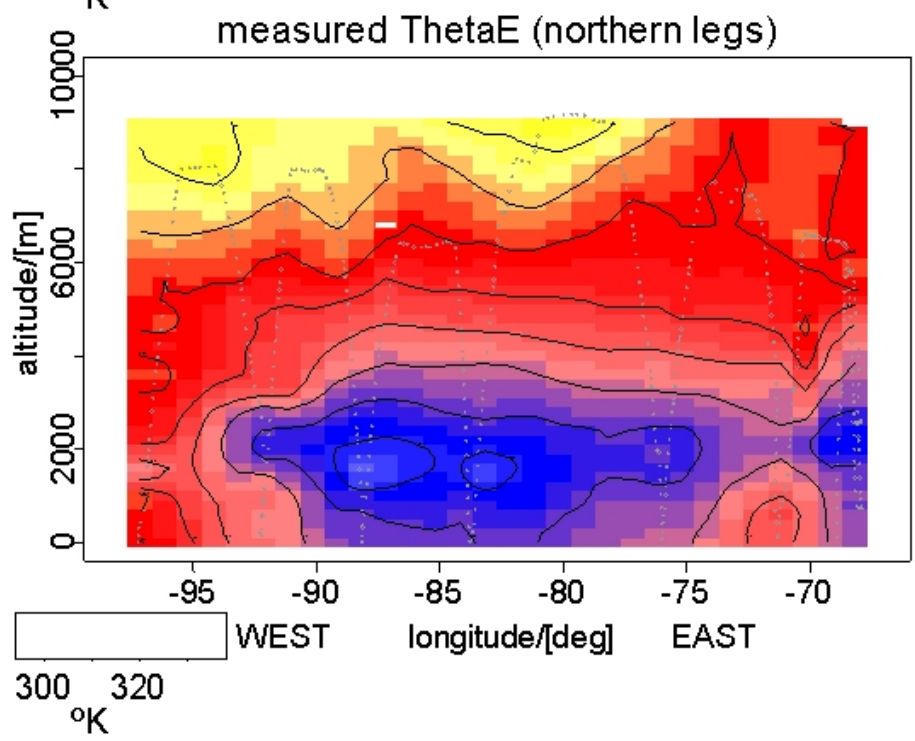
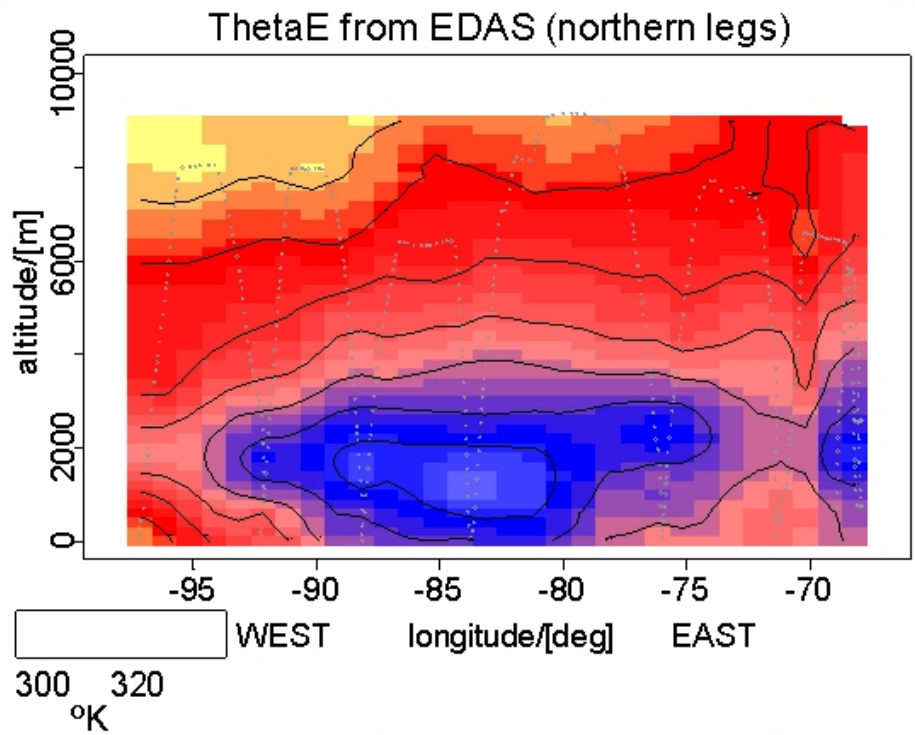
## STILT results using optimized NEE: North

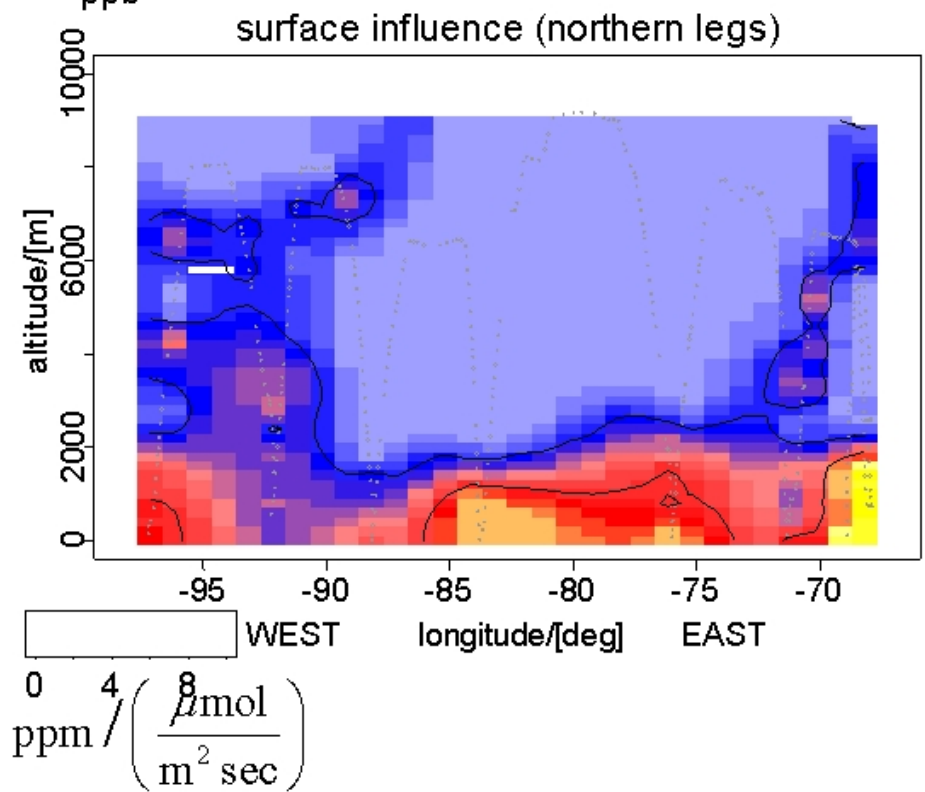
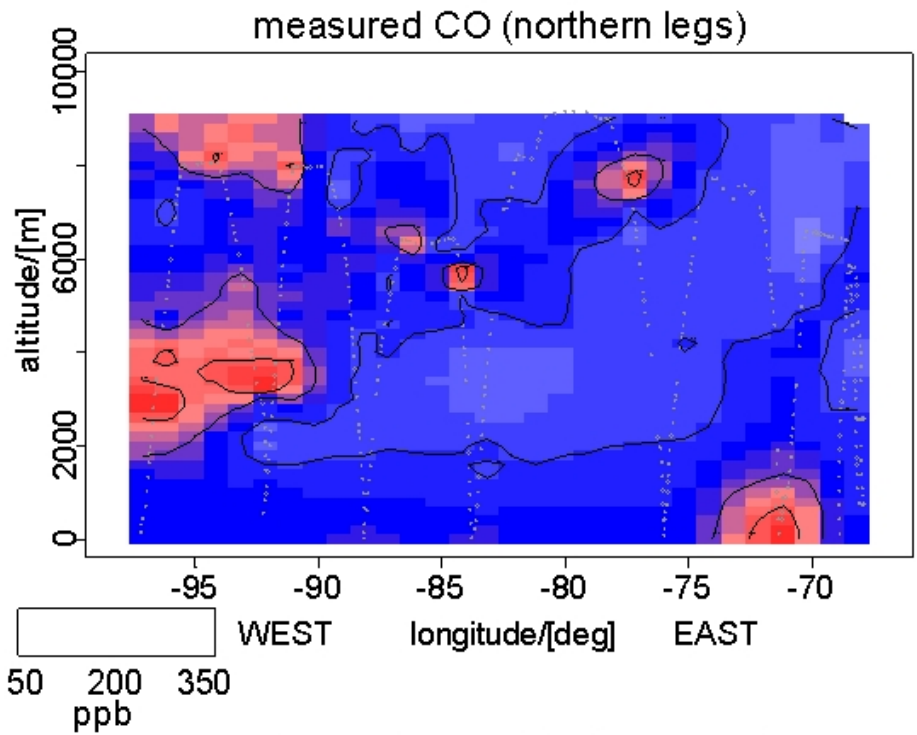


	NEE factor $\lambda_i$	Statistical error	$r^2$
Forests	1.1	0.06	0.57
Cropland	0.75	0.08	



# $\Theta_e$ measured versus EDAS (Northern legs)





## CONCLUSIONS

- ***value of intense atmospheric sampling efforts***

- examine variability of CO<sub>2</sub>

- understand variability when assimilating observations into models

- assess representativity of obs at long-term monitoring stations

- intense airborne data provides good test of model results

- ***aircraft observations, combined with a tool like STILT, have potential to constrain terrestrial C fluxes***

- errors in atmospheric transport need to be quantified and understood

- ***future: value of combining airborne obs with other models***

- synergy with global models: use STILT as near-field tool close to obs, but have global models simulate boundary-conditions over the ocean