

The interaction of scales between carbon cycling in the atmosphere and in the terrestrial biosphere

Wouter Peters, Wageningen University, the Netherlands

Global transport models are used in a wide array of applications that range from short time scales (air-quality predictions) to much longer ones (greenhouse gas budgets). It has been shown repeatedly that the ability of these models to simulate transport across these time scales varies: most do poorly on diurnal time scales because night-time stable boundary layer conditions are poorly captured, all do really well on synoptic time scales because reanalyzed meteorological fields are used as driver data, and at seasonal to interannual time scales performance varies strongly for reasons that are not well understood. Stephens et al., (2007) for instance showed that models predict very different vertical gradients between the surface and 4 km altitude, likely because of different dry and wet convective exchange. Vila et al. (2004), and Pino et al., (2012) point strongly to entrainment and boundary layer growth as dominant controls on CO₂ mixing ratios under convective conditions. But recent analyses from Williams et al. (2012), Sinclair et al (2010), and Parazoo et al., (2011) suggest that exchange of trace gases is dominated by synoptic systems and their ability to vent the PBL in large 5-10 day sweeps. In that light, it is interesting to note that even within one modeling framework (TM5 in this case) the large scale transport properties can vary strongly depending on which (mainly vertical) driver data is used from its parent ECMWF model. Together, these diverse studies raise the question: which scale is important to capture in transport models when one wants to investigate regional CO₂ budgets?

In the presentation, two examples are given of carbon-water-energy exchange on relatively short time scales. One is crop-atmosphere interactions on hourly time scales, and the other one is interactions between the atmospheric PBL development and the CO₂ budget on diurnal scales. Both studies share a simple but powerful diagnostic tool, the mixed-layer model of the atmosphere. And in both studies, we pay special attention to the coupling points between the carbon-water-energy systems, given by the simulated stomatal resistance and the PBL height.

In our first example we demonstrate that the crop model is an excellent tool to simulate the progression of carbon and water exchange along the seasonal growth curve of the plant. However, it falls short on simulating the energy budget that goes along with that exchange, producing negative sensible heat fluxes on many days. The reason is that the simulated crop nearly always operates at full potential evaporation, taking energy from the atmosphere if needed to continue carbon uptake. In the crop model, this normally does not affect the atmosphere because it is a prescribed reservoir (from observations). But in a coupled mode with the mixed-layer providing dynamic top boundary conditions, this obviously would lead to a rapid cooling of the lower atmosphere blocking vertical trace gas exchange even on a sunny day. While stomatal resistance, net ecosystem exchange, crop growth, water-use efficiency, and latent heat are thus all reasonable for this crop growth model, it would fail completely to predict the observed PBL height, stressing the need to simultaneously assess vegetation dynamics and atmospheric dynamics.

Similarly, our second example shows a straightforward method to estimate errors in daytime simulated CO₂ (or inversely, the CO₂ surface flux) as a function of errors in dynamical variables in the mixed-layer. These errors were estimated based on a suite of simulations with the WRF-CHEM transport model using three popular parameterizations for vertical mixing near the surface (YSU,

MYJ, MYNN2.5), and two different CO₂ surface flux implementations (SIBCASA, A-Gs). By selecting a set of >100 mixed-layer days/locations over Europe for the month of June, these errors were categorized and shown to be potentially very large: errors in the early morning PBL height (setting the mixing volume for night-time CO₂) can lead to errors of 0.5 to 5.0 ppm during the day (0.75 ppm median), while a misrepresentation of the CO₂ abundance above the PBL height (the concentration to be entrained) is in the same order of magnitude. Typical errors in the simulation of the PBL height itself (estimated to be a median of 260 meters) cause typical errors in estimated fluxes of 20% or more. This is not just an effect of the depth of the mixing volume, but also because different PBL growth rates introduce different amounts of free tropospheric CO₂ into the PBL, and further affect surface dynamics by increasing evaporative demand (dry air is entrained).

These examples together demonstrate the important coupling between numerical weather prediction (NWP) and the CO₂ budget. Not only would CO₂ modeling profit from having the best atmospheric (vertical) transport available, but also an estimate of the NWP errors (for instance from an ensemble of surface-atmosphere exchange couplings) can help to improve estimates of CO₂ fluxes. Finally, better understanding of surface exchange of CO₂ also directly benefits the surface water and energy balance through the coupling points identified in the presentation (stomatal resistance and PBL height), and thus help to improve weather forecasts. This conclusion underlies some of the recommendations made in the workshop that followed.

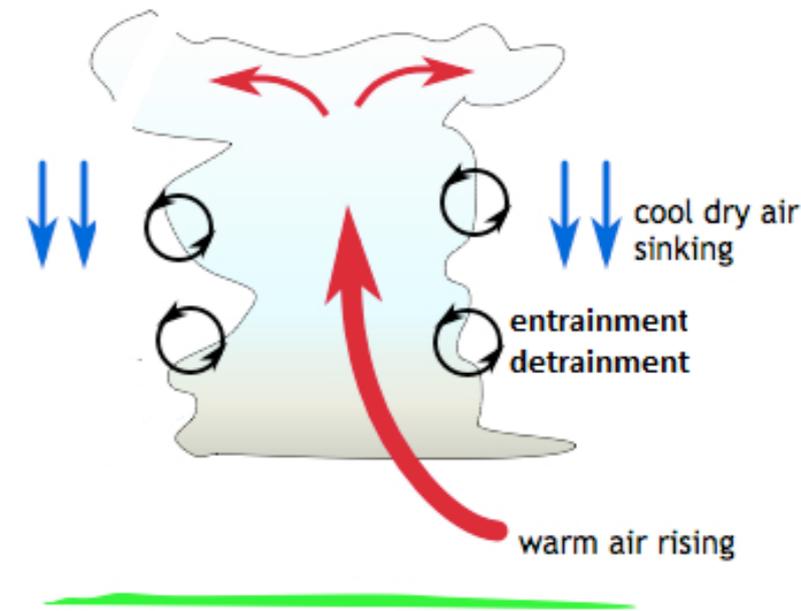
The interaction of scales between carbon cycling in the atmosphere and in the terrestrial biosphere

Wouter Peters

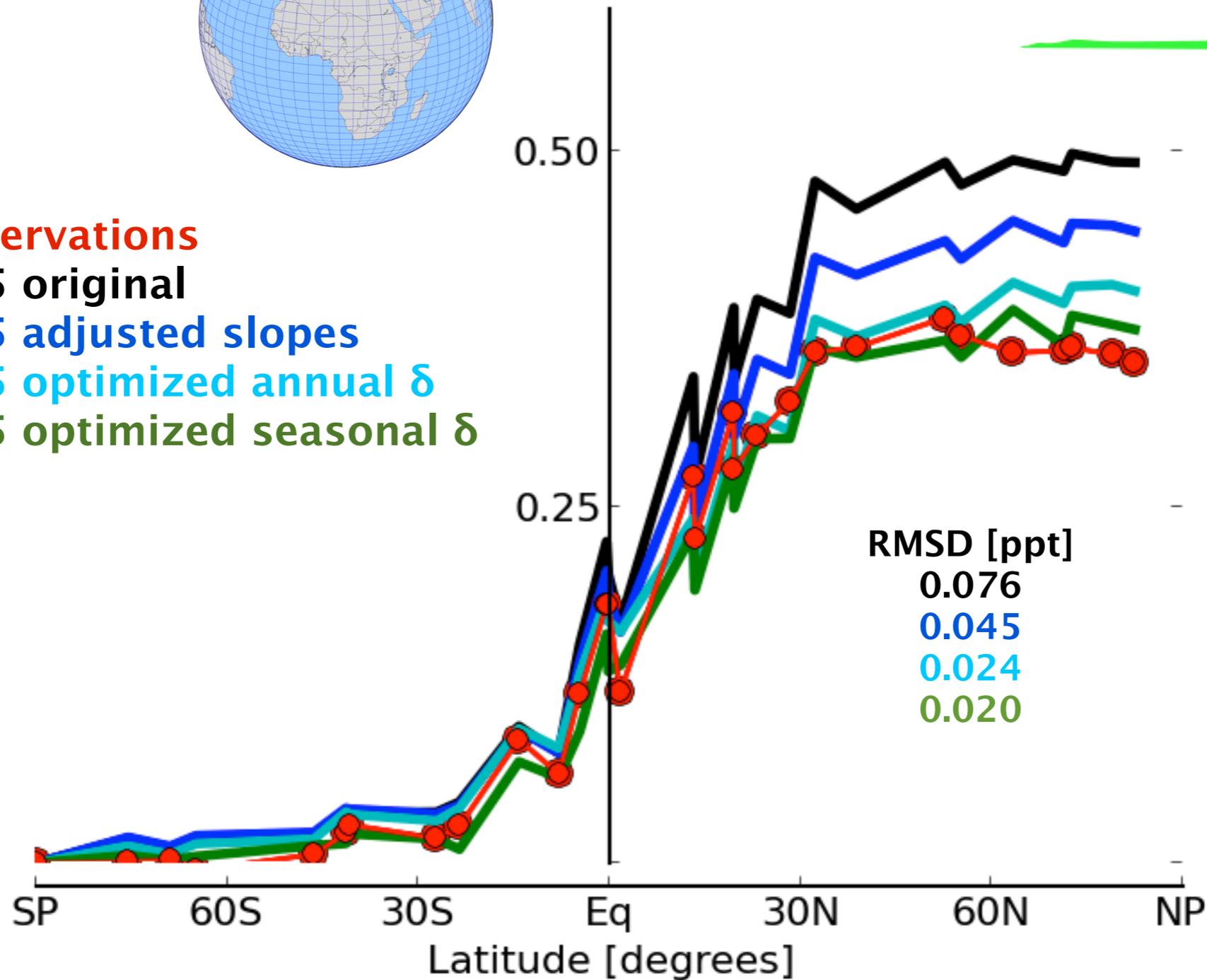
**Jordi Vila, David Pino, Maarten
Krol, Marie Combe, Emma van der
Veen, Jieying Ding**



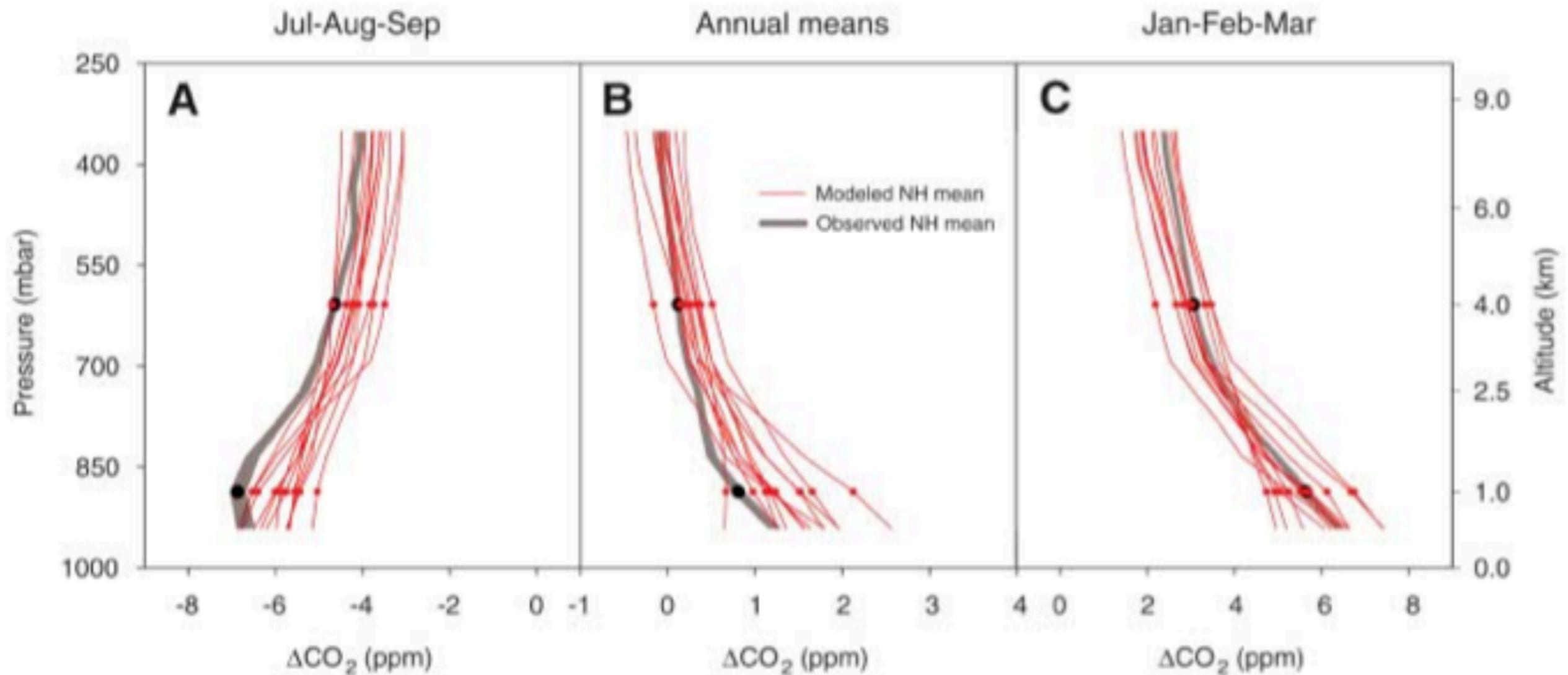
SF₆ North-South gradient in TM5



Observations
TM5 original
TM5 adjusted slopes
TM5 optimized annual δ
TM5 optimized seasonal δ



CO₂ gradients in transport models

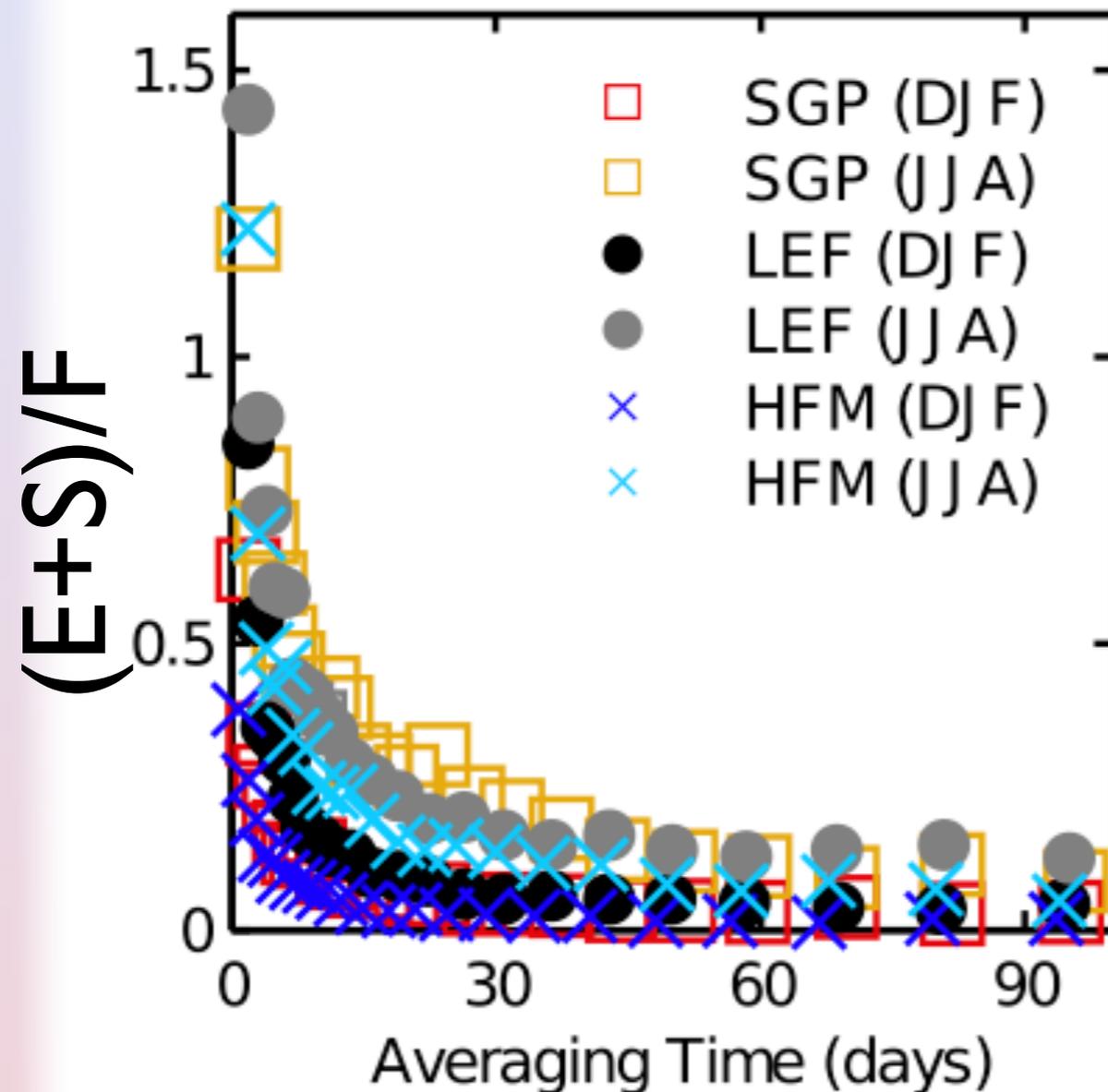


Weak Northern and Strong Tropical Land Carbon Uptake from Vertical Profiles of Atmospheric CO₂

Britton B. Stephens,^{1*} Kevin R. Gurney,² Pieter P. Tans,³ Colm Sweeney,³ Wouter Peters,³ Lori Bruhwiler,³ Philippe Ciais,⁴ Michel Ramonet,⁴ Philippe Bousquet,⁴ Takakiyo Nakazawa,⁵ Shuji Aoki,⁵ Toshinobu Machida,⁶ Gen Inoue,⁷ Nikolay Vinnichenko,^{8†} Jon Lloyd,⁹ Armin Jordan,¹⁰ Martin Heimann,¹⁰ Olga Shibistova,¹¹ Ray L. Langenfelds,¹² L. Paul Steele,¹² Roger J. Francey,¹² A. Scott Denning¹³



What controls the exchange of CO₂ (and other gases) across the top of the planetary boundary layer height?



$$F = S + E + V + H$$

F = surface flux

S = storage

E = entrainment

V = vertical advection

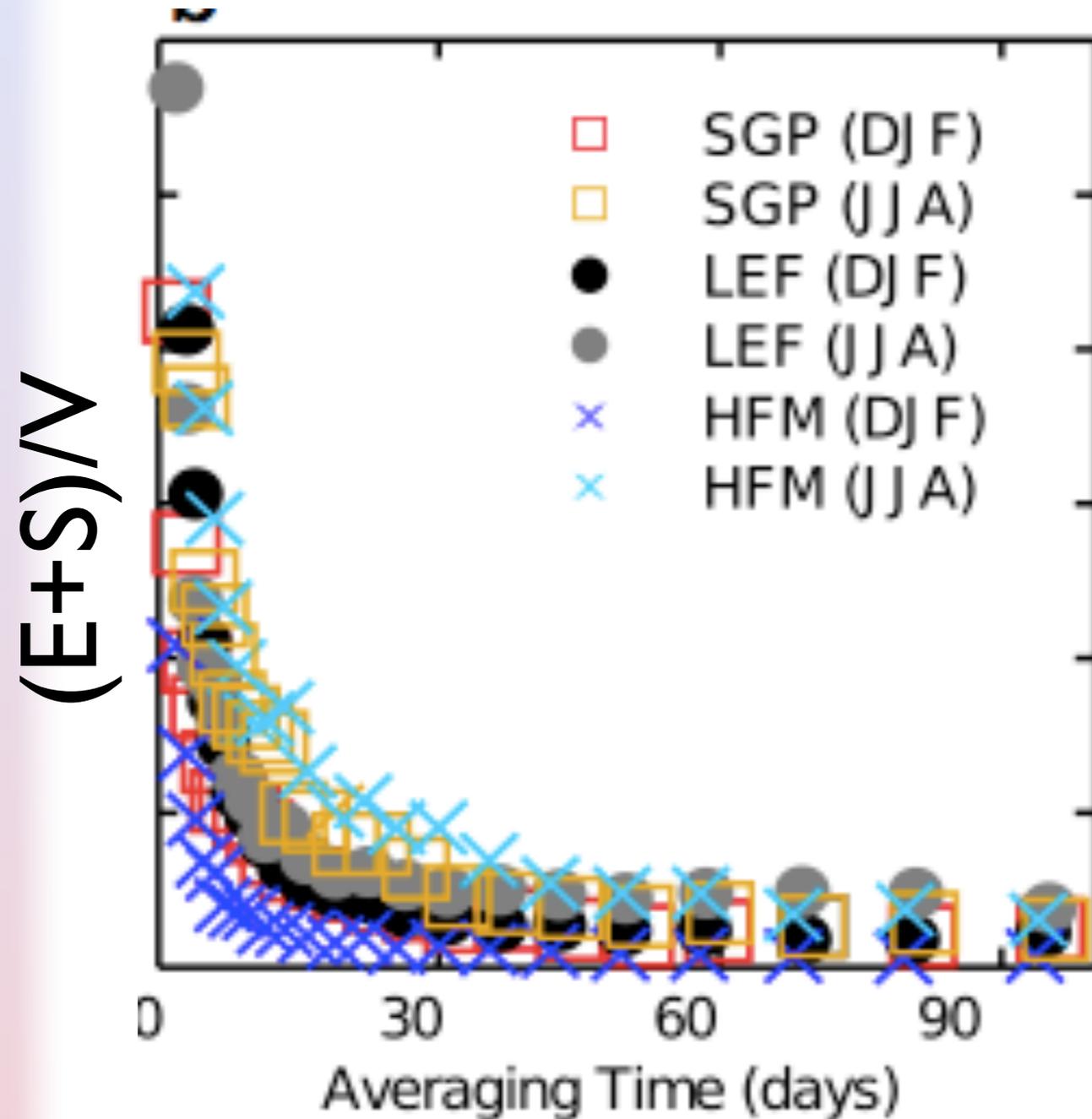
H = horizontal advection

Using boundary layer equilibrium to reduce uncertainties in transport models and CO₂ flux inversions

I. N. Williams¹, W. J. Riley², M. S. Torn², J. A. Berry³, and S. C. Biraud²



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● What controls the exchange of CO₂ (and other gases) across the top of the planetary boundary layer height?

Controls on boundary layer ventilation: Boundary layer processes and large-scale dynamics

V. A. Sinclair,^{1,2} S. L. Gray,¹ and S. E. Belcher¹

Moist synoptic transport of CO₂ along the mid-latitude storm track

N. C. Parazoo,¹ A. S. Denning,¹ J. A. Berry,² A. Wolf,³ D. A. Randall,¹ S. R. Kawa,⁴ O. Pauluis,⁵ and S. C. Doney⁶

Large-scale (synoptic) control on CO₂ exchange!





● What controls the exchange of CO₂ (and other gases) across the top of the planetary boundary layer height?

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Large-scale (synoptic) control on CO₂ exchange!

...but small scales control near surface CO₂ variations





Two examples, two scales

- (1) Crop-Atmosphere interactions

The boundary layer and biosphere form one dynamic system with two main coupling points

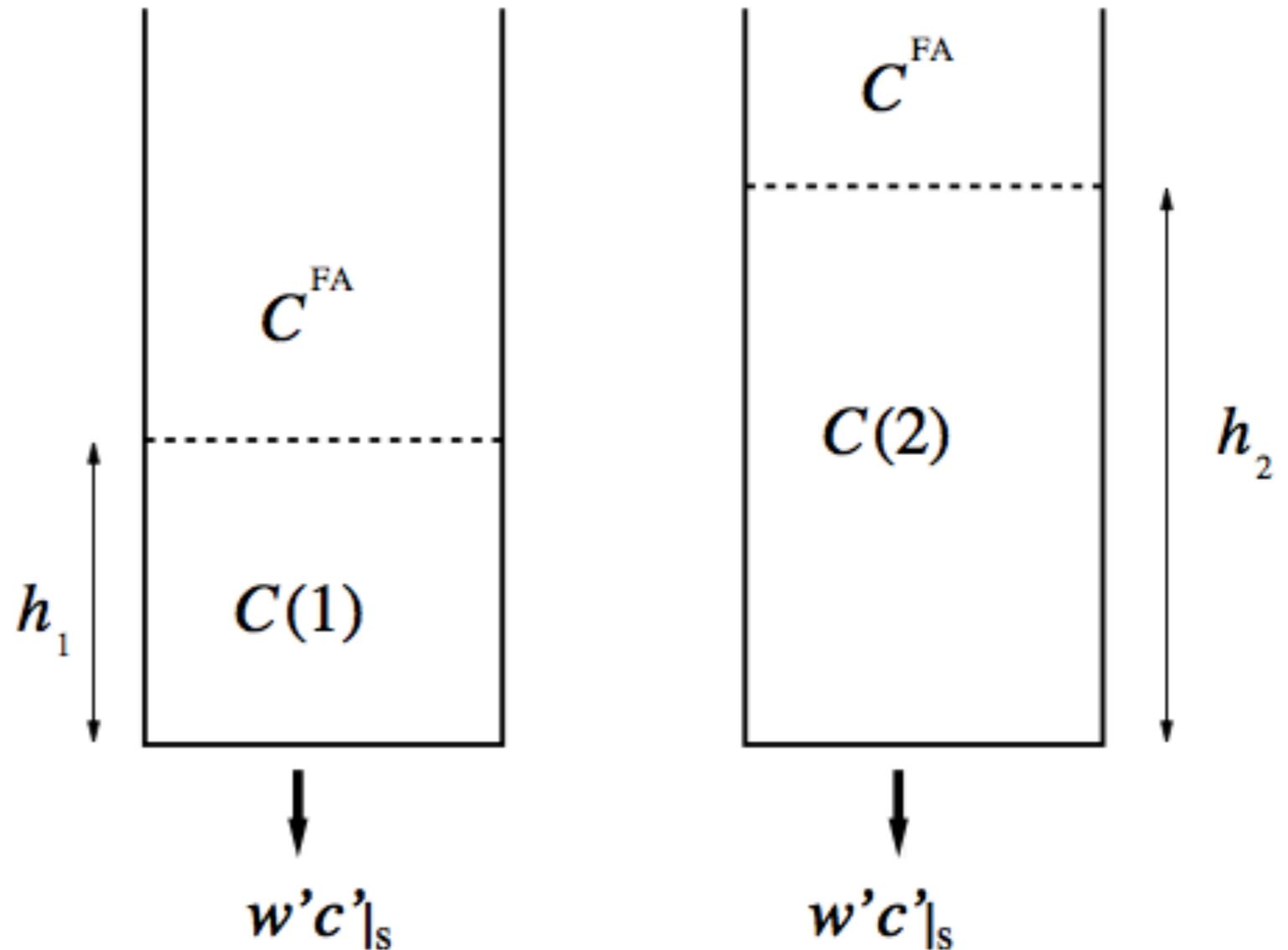
- (2) Mixed-layer modeling of CO₂ errors

These coupling points can be a key diagnostic for simulations of the carbon balance



Mixed-layer modeling

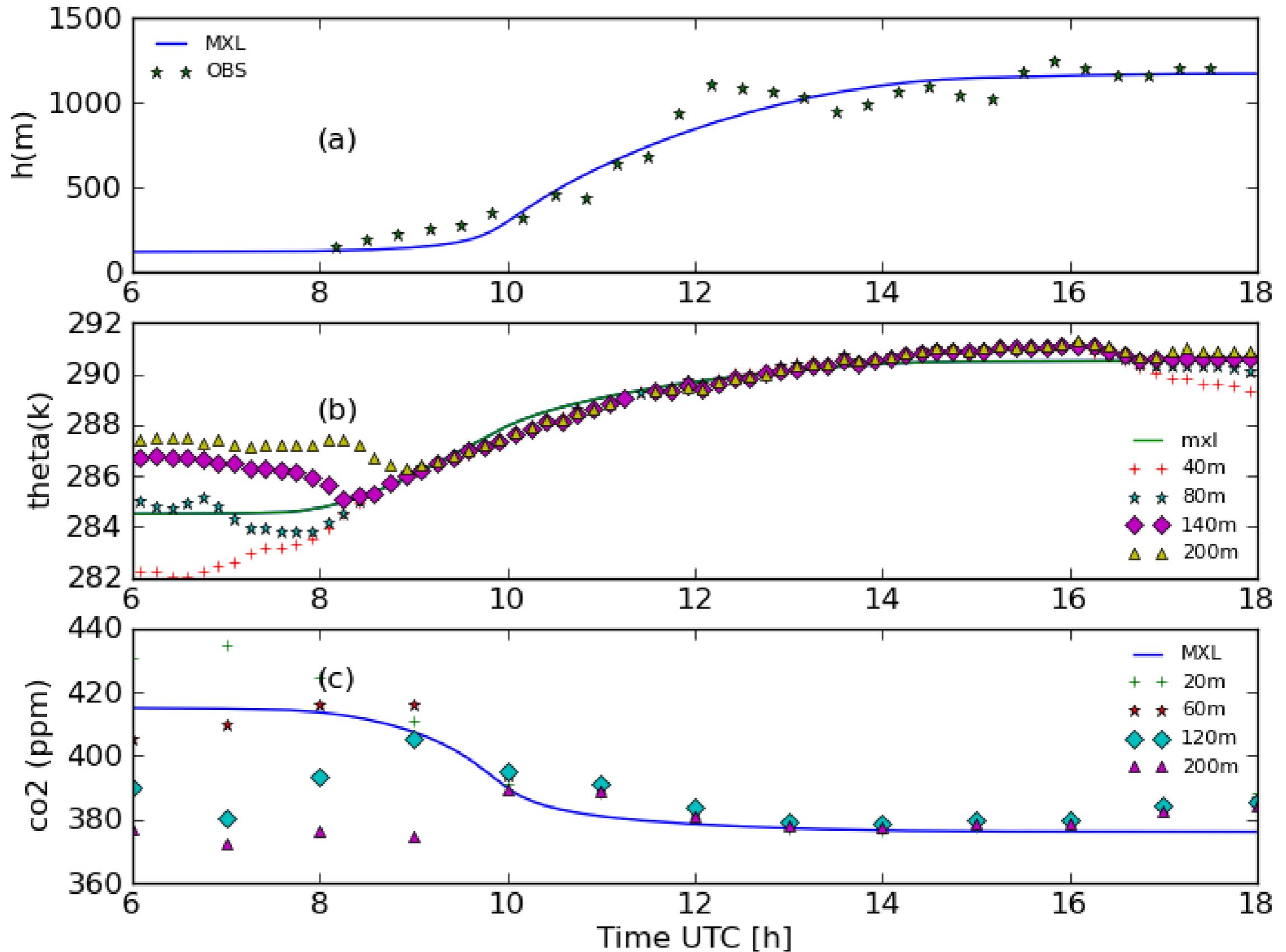
$C = \text{CO}_2$ mole fraction
 $h = \text{PBL height}$
 $w'c' = \text{CO}_2$ surface flux
 $\text{FA} = \text{Free Atmosphere}$
 $t = \text{time}$



$$\frac{\partial(C h)}{\partial t} = \overline{w c o_2}|_s + C^{fa} \frac{\partial(h - h_0)}{\partial t},$$



Mixed-layer modeling





Mixed-layer modeling

A conceptual framework to quantify the influence of convective boundary layer development on carbon dioxide mixing ratios

D. Pino¹, J. Vilà-Guerau de Arellano², W. Peters², J. Schröter², C. C. van Heerwaarden³, and M. C. Krol²

$$C = C_0 \frac{h_0}{h} + C_0^{fa} \left(1 - \frac{h_0}{h}\right) + \frac{\gamma_{CO_2}}{2h} (h - h_0)^2 + \frac{t - t_0}{h} \langle \overline{wCO_2}|_s \rangle,$$

$$\langle \overline{wCO_2}|_s \rangle = \frac{1}{t - t_0} \left[Ch - C_0 h_0 - C_0^{fa} (h - h_0) - \frac{\gamma_{CO_2}}{2} (h - h_0)^2 \right].$$

$C = CO_2$ mole fraction

$C_0 =$ morning CO_2 mole fraction

$h =$ PBL height

$h_0 =$ morning PBL height

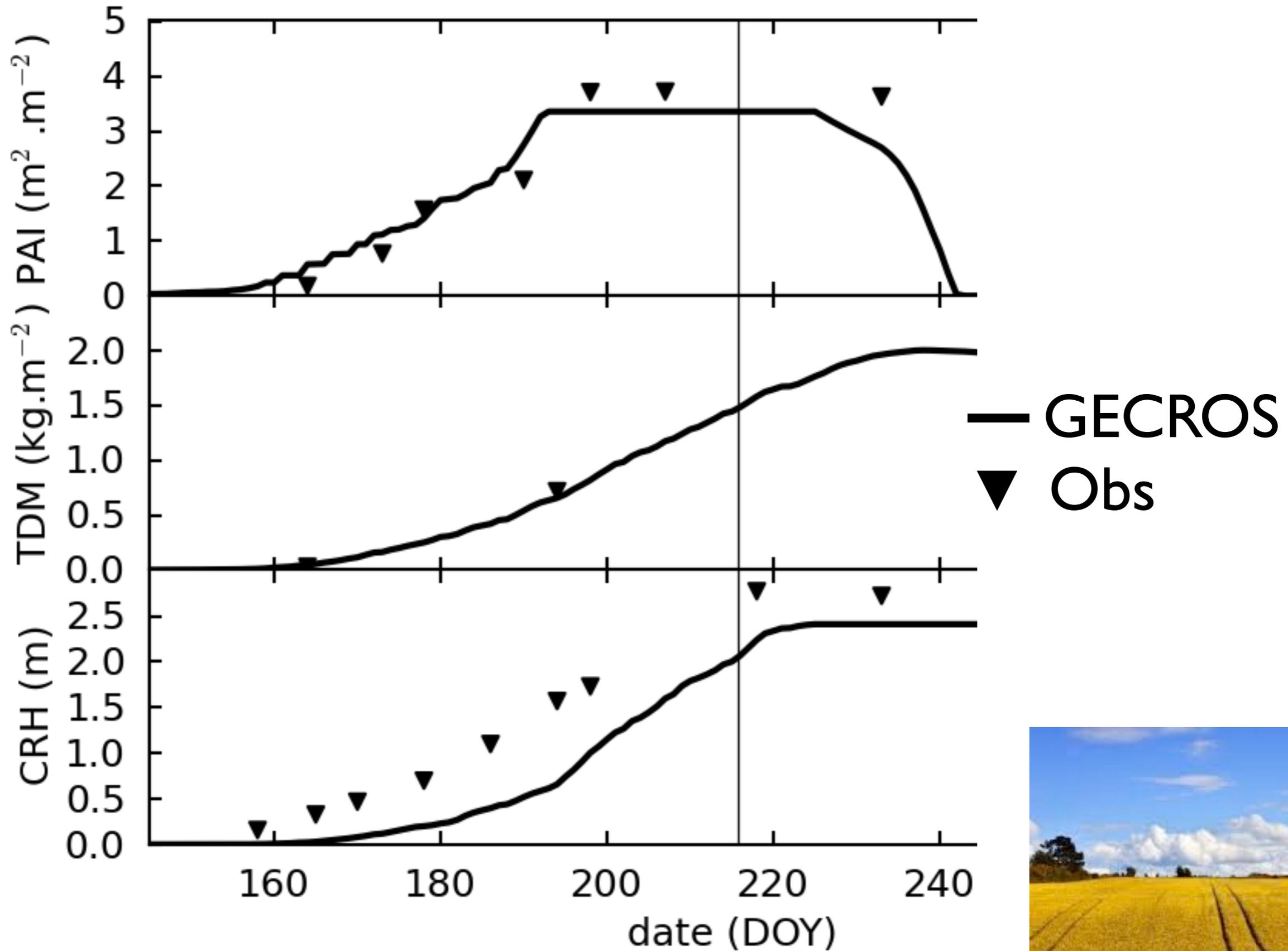
$\langle w'c' \rangle =$ mean CO_2 surface flux

FA = Free Atmosphere

$\gamma =$ lapse rate CO_2

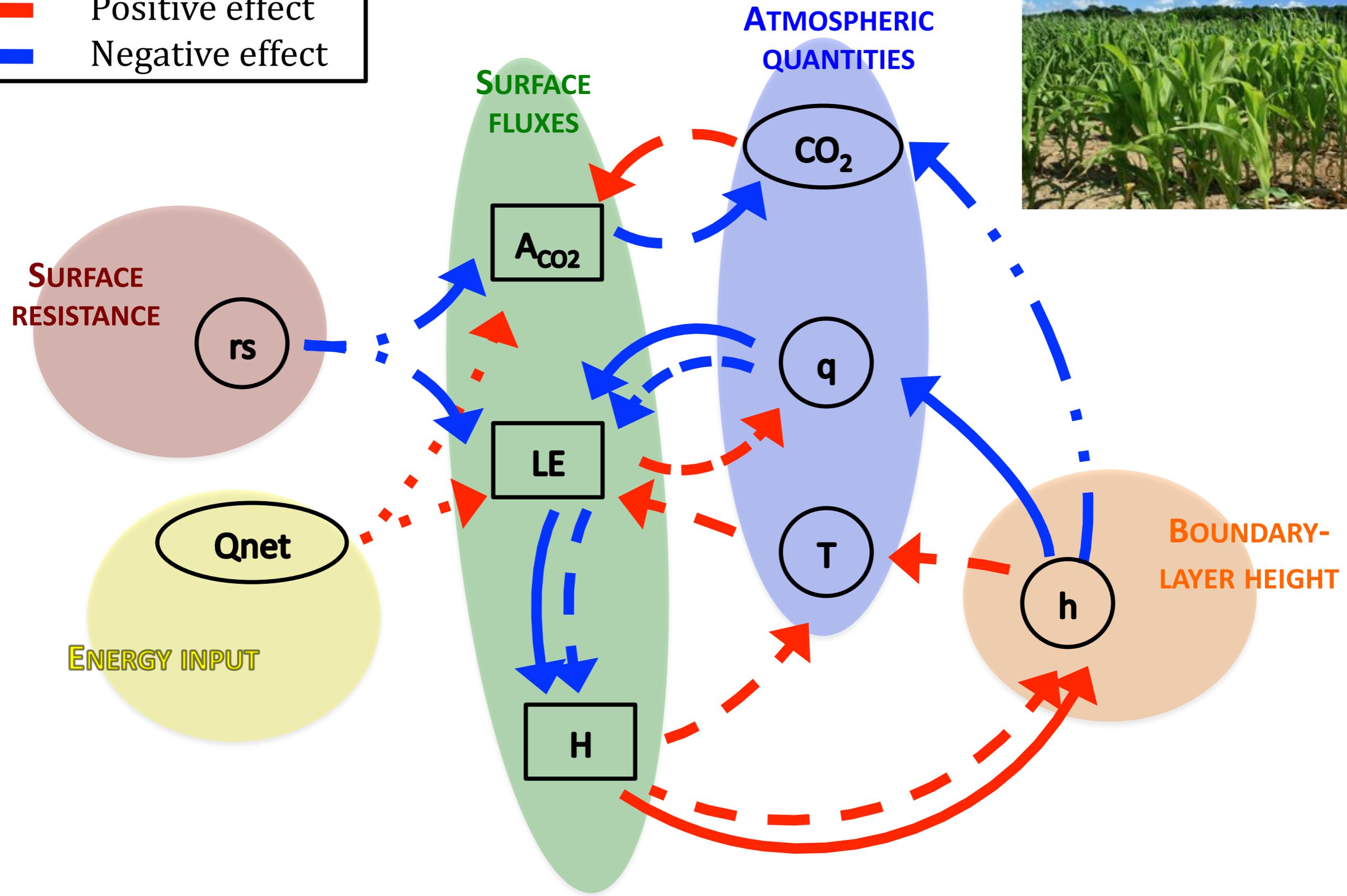


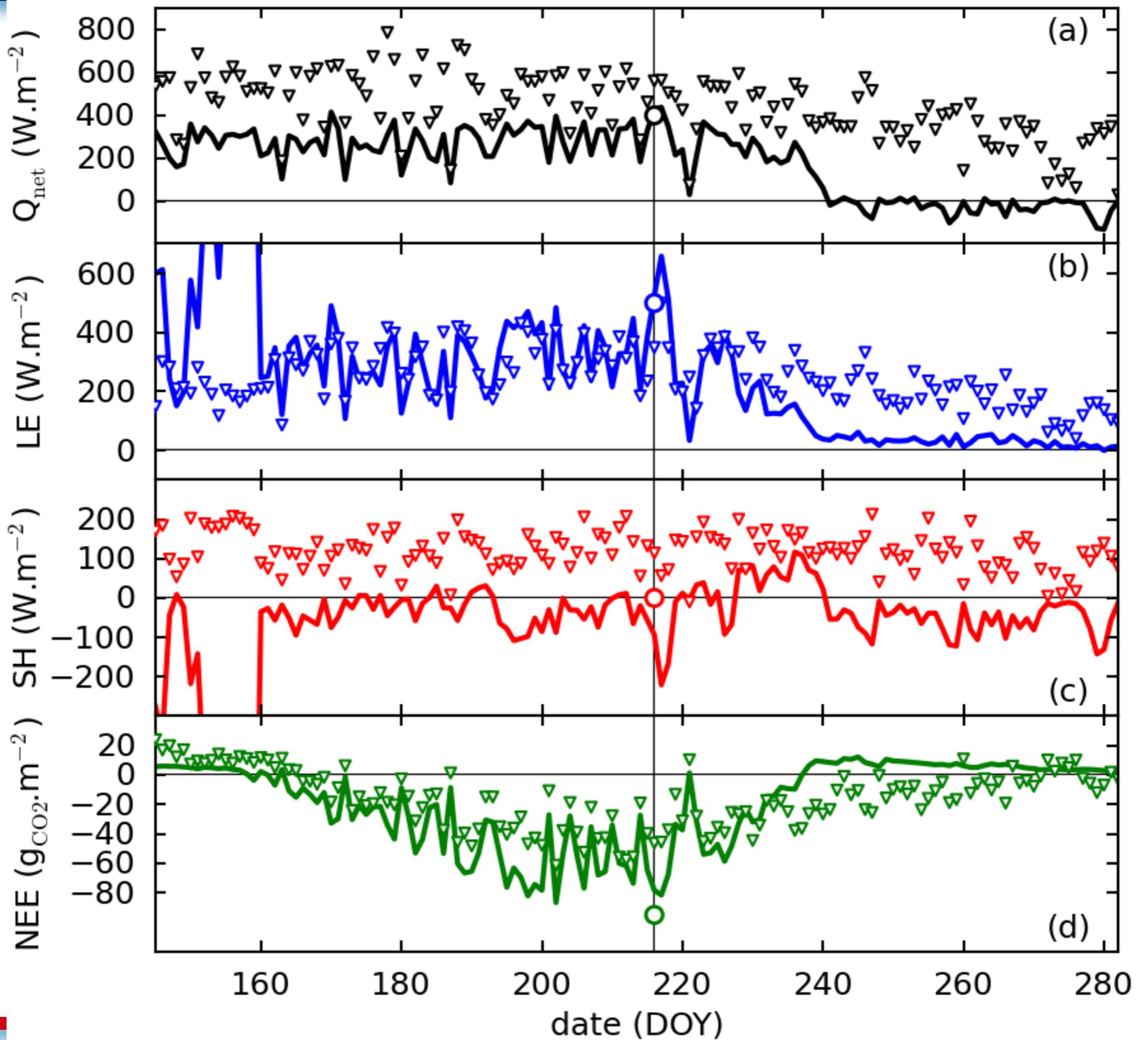
(1) Crop-Atmosphere interactions



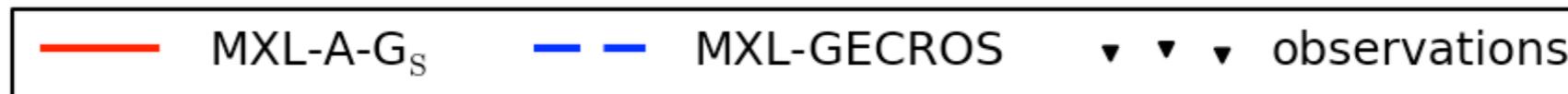
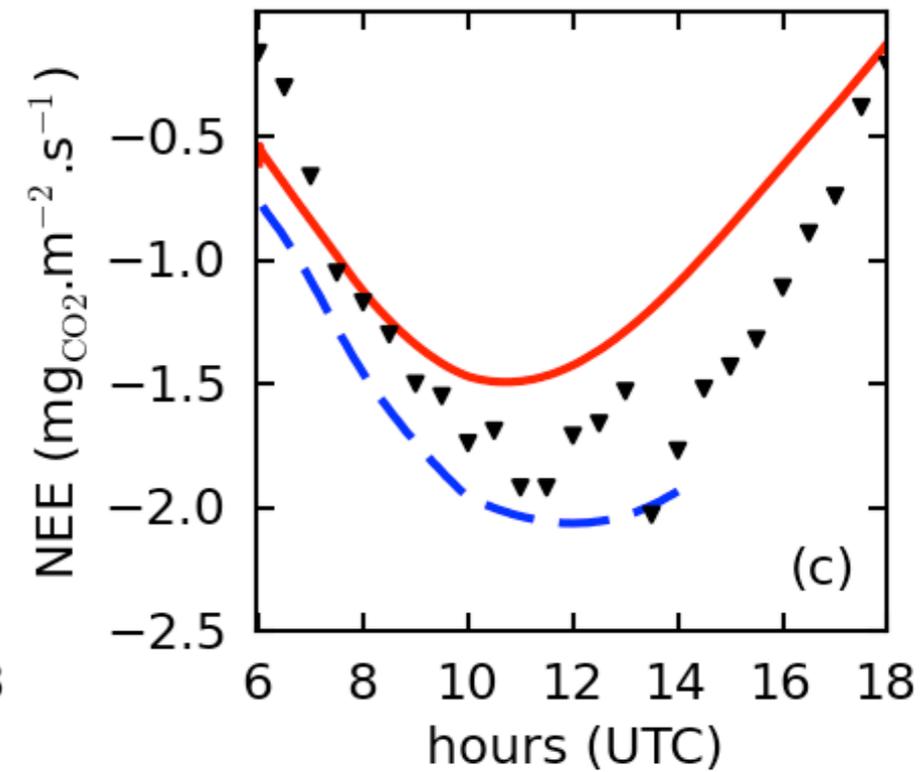
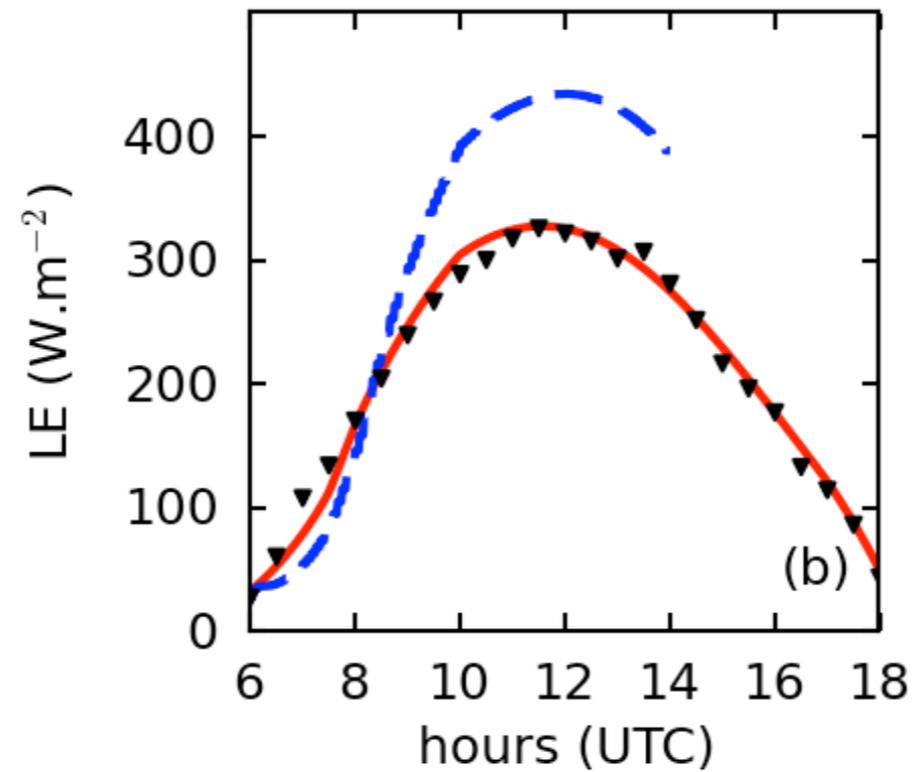
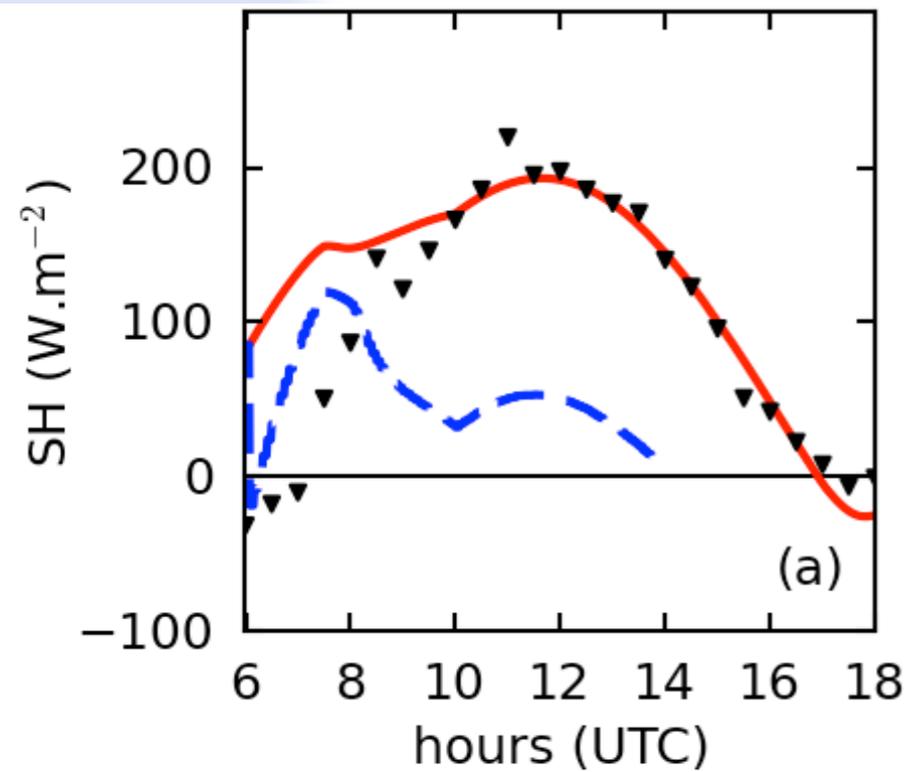


Positive effect
Negative effect

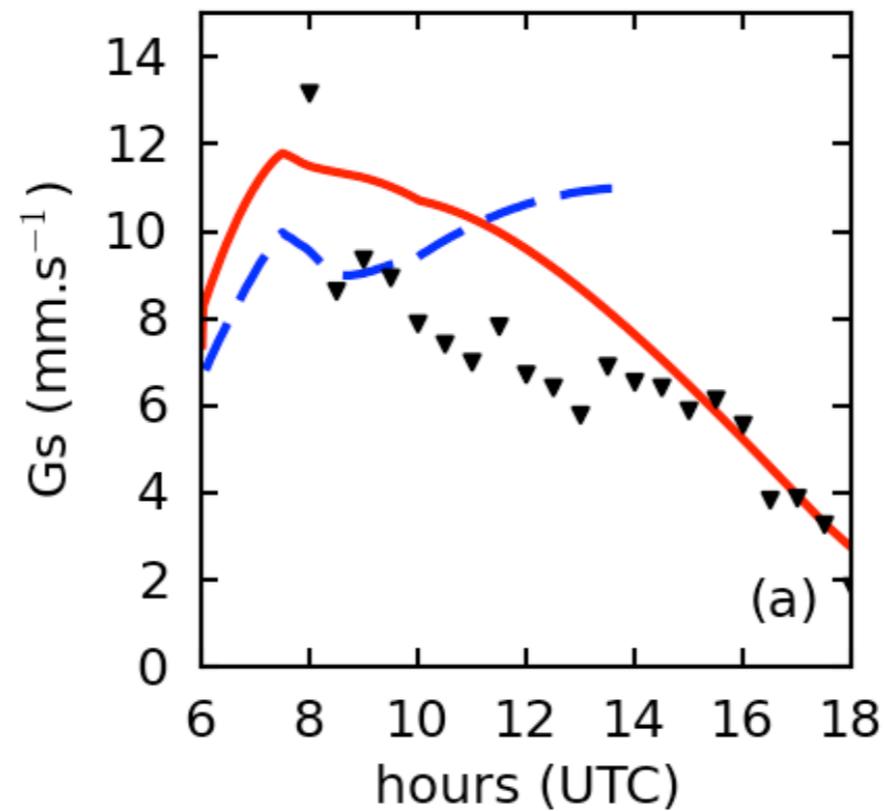
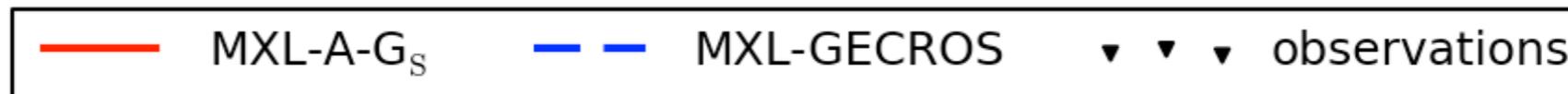
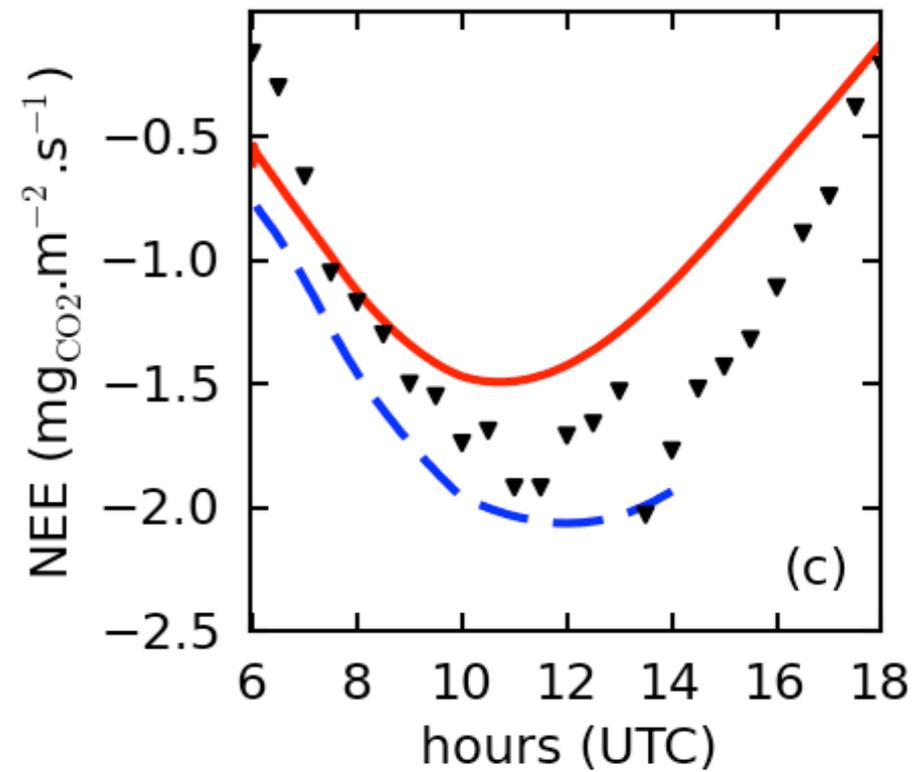
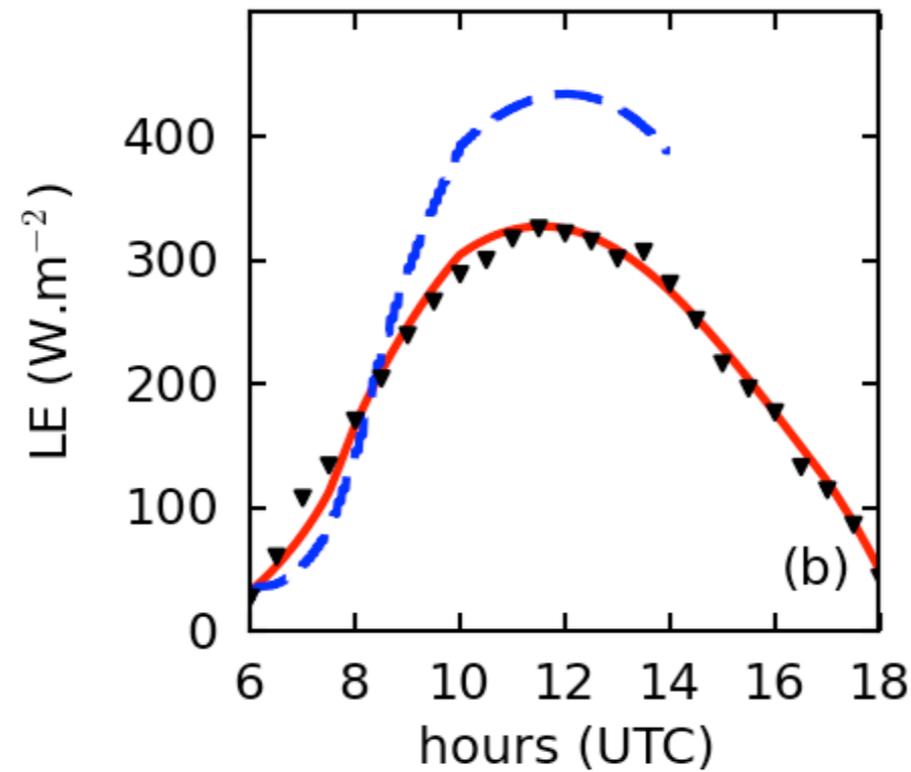
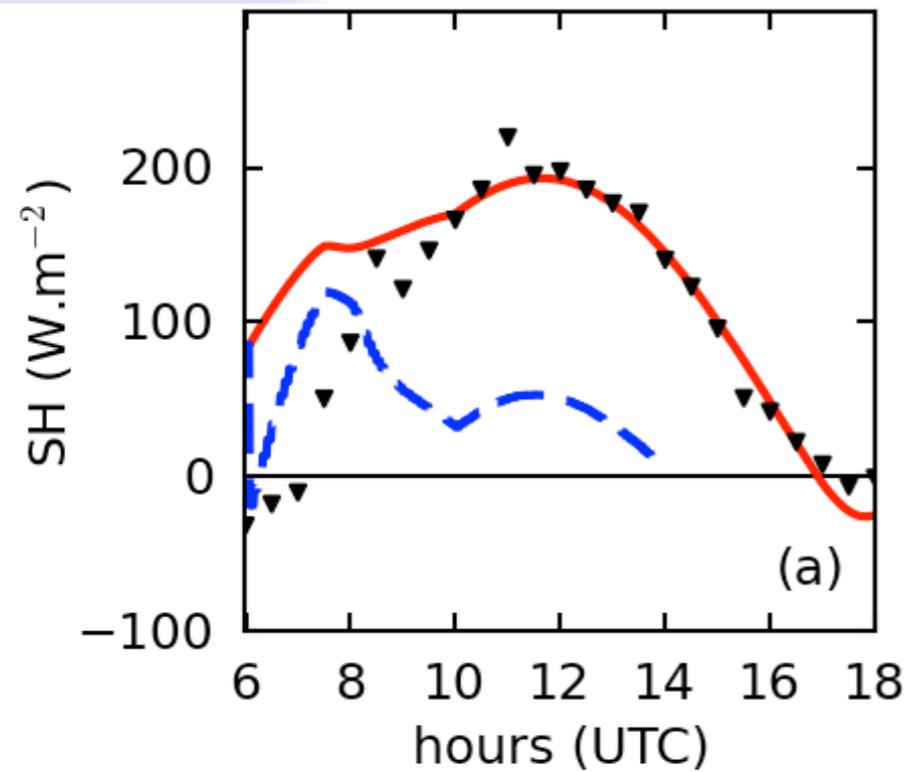




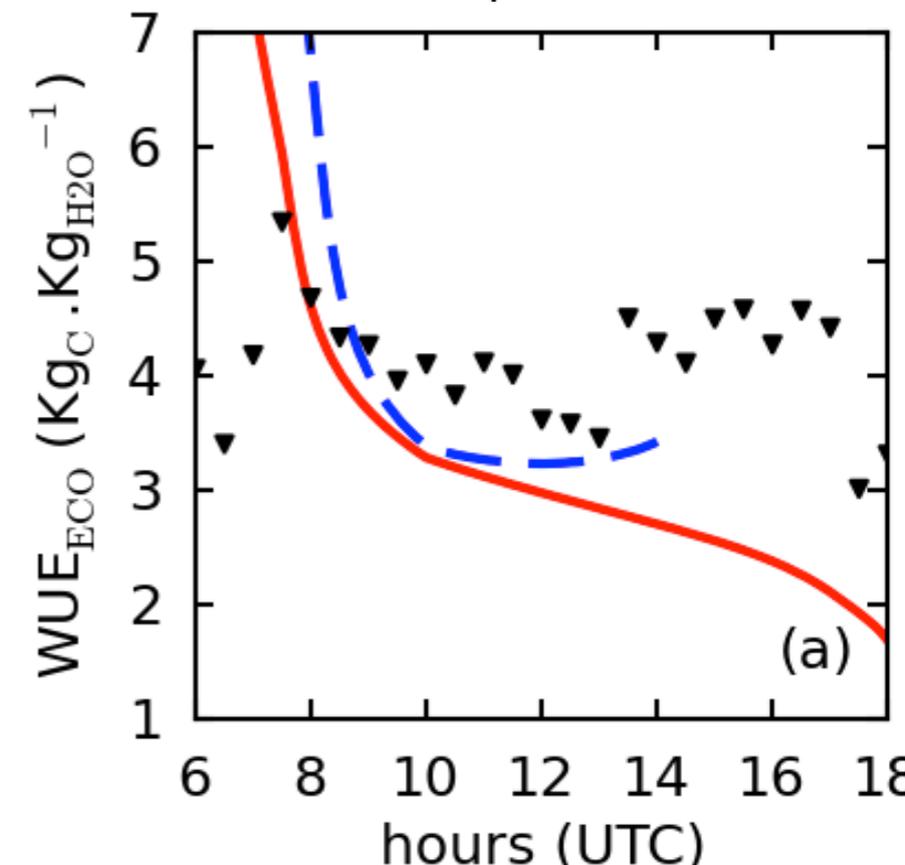
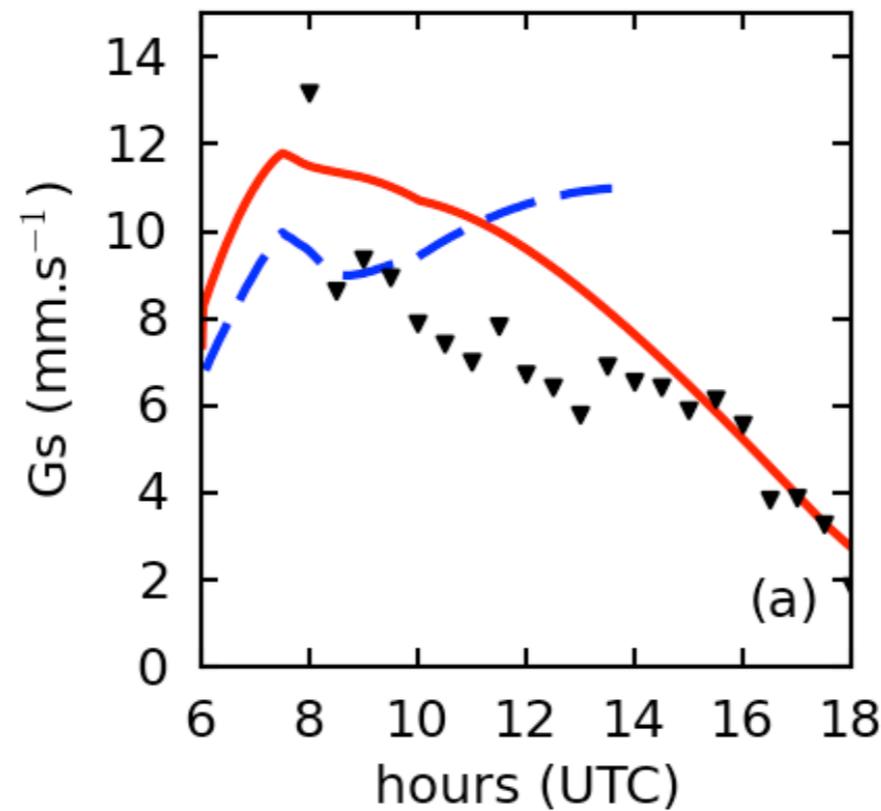
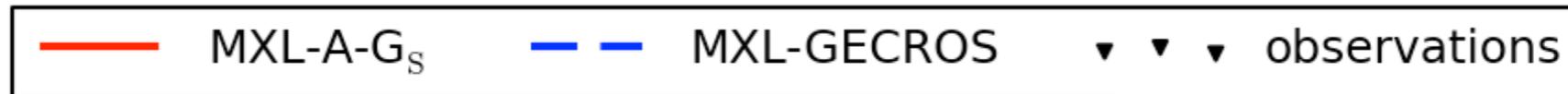
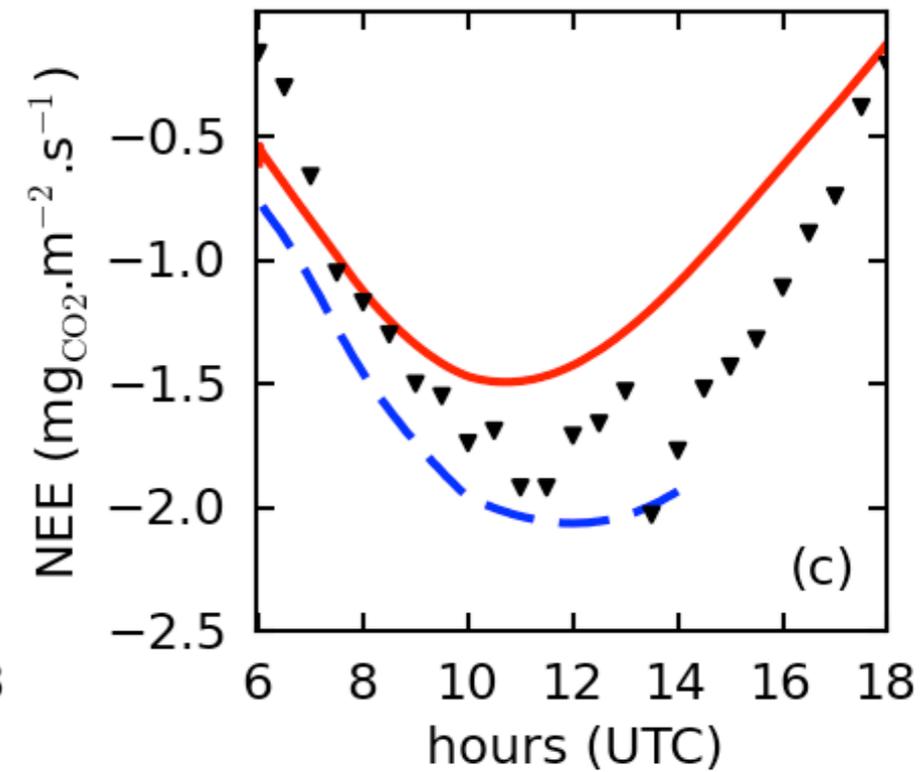
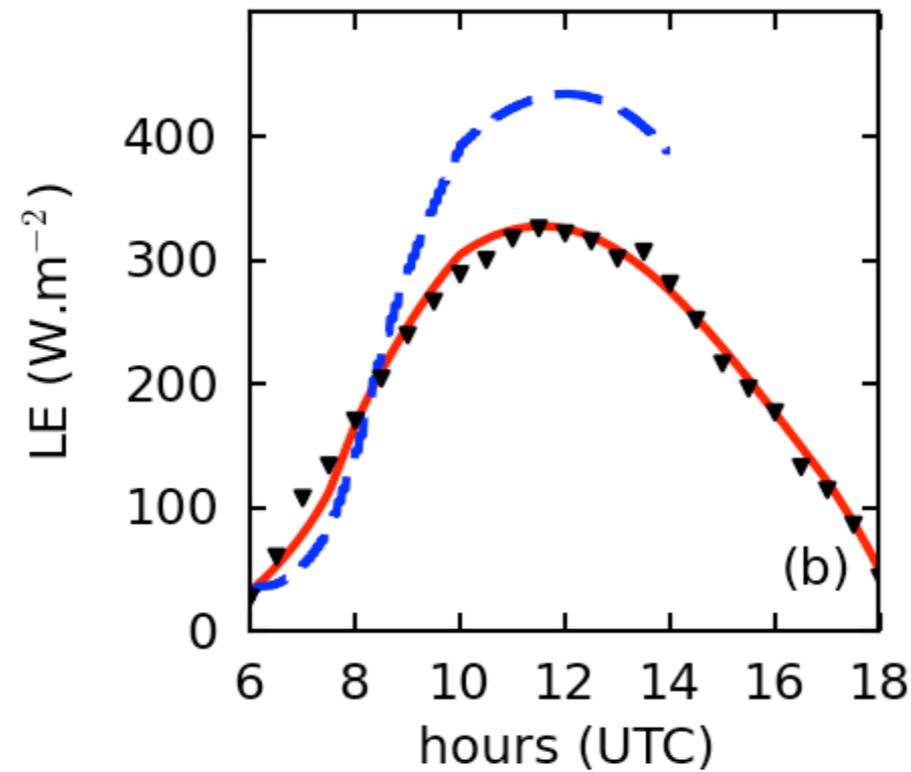
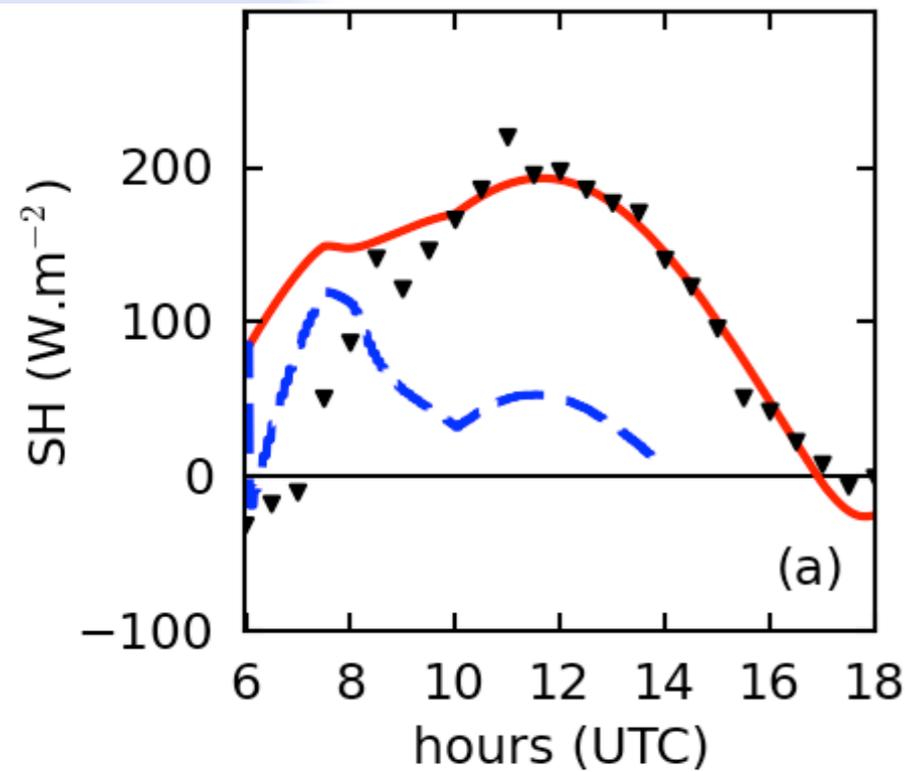
Surface fluxes



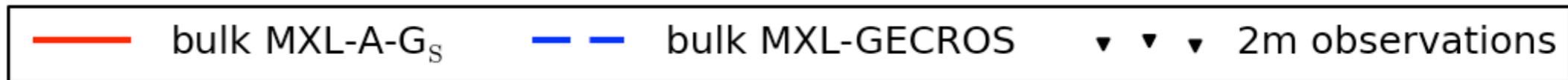
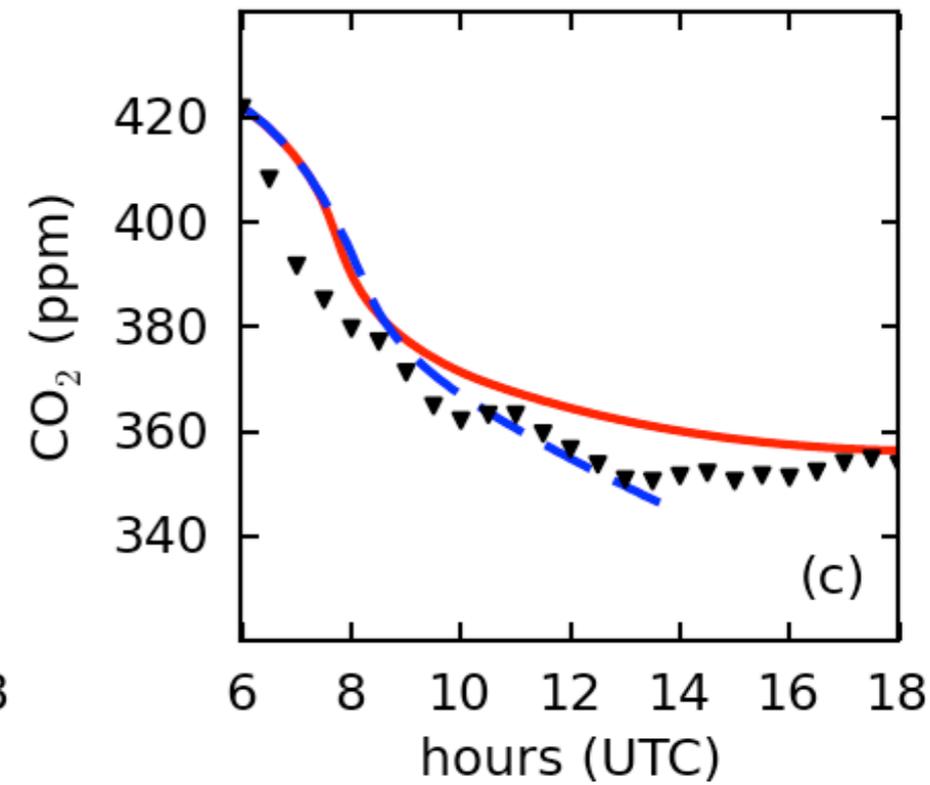
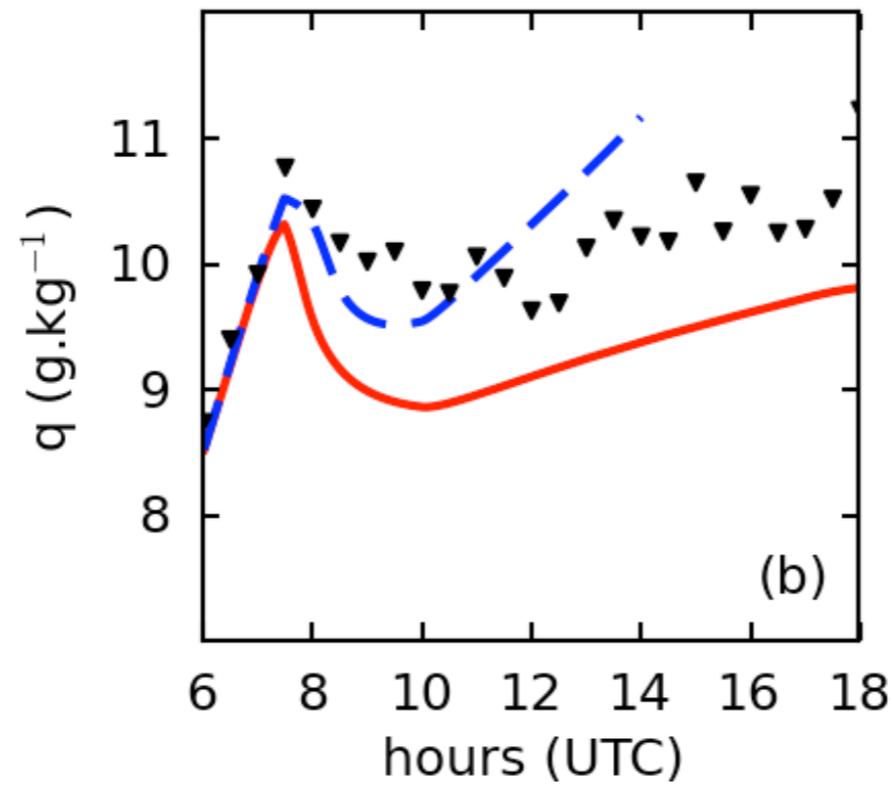
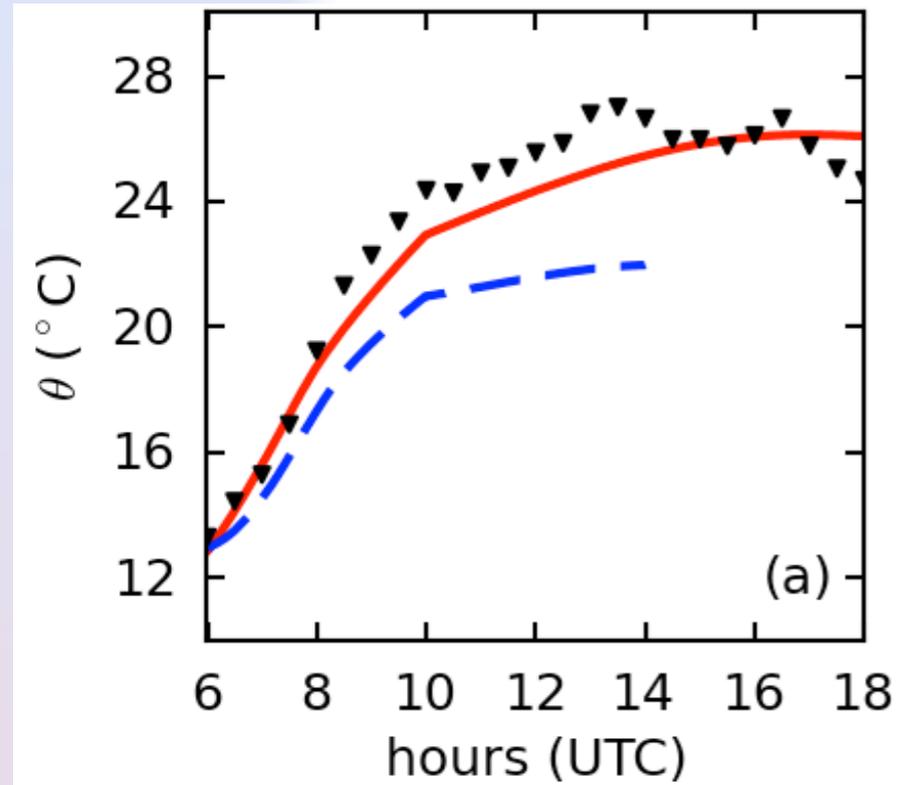
Surface fluxes



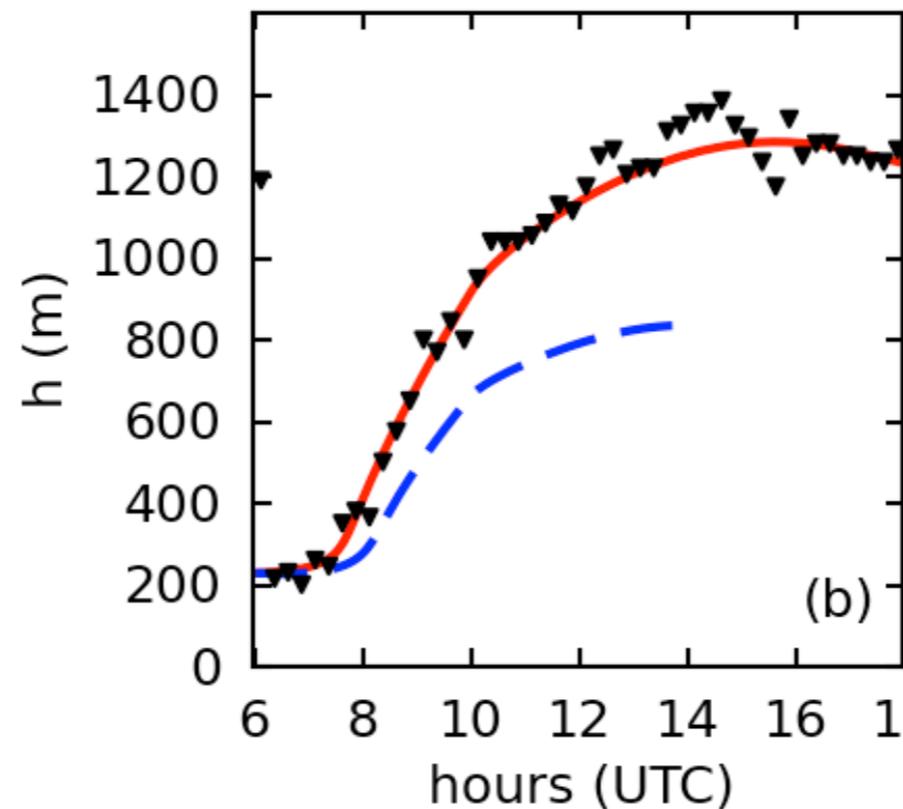
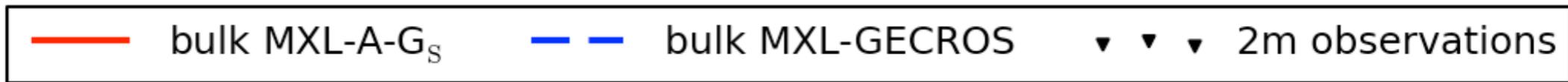
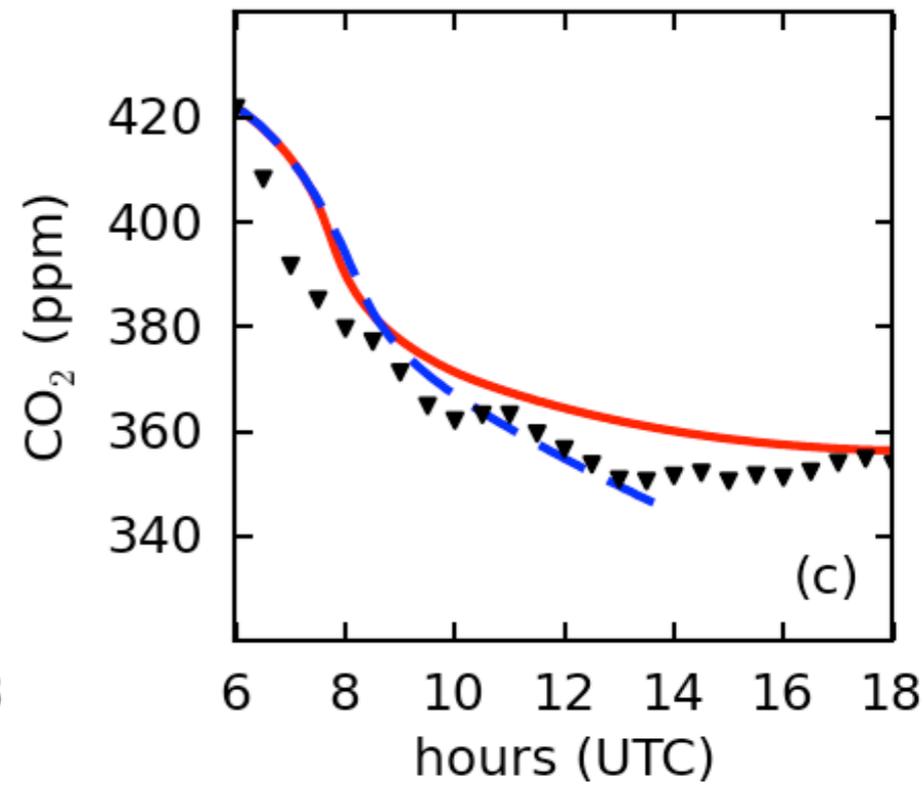
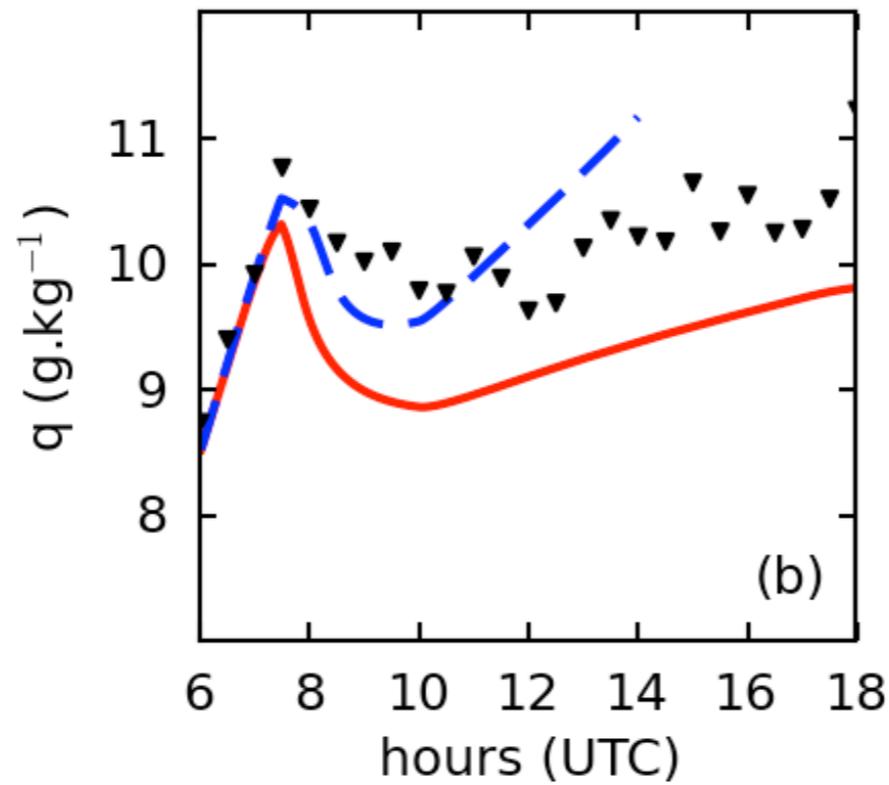
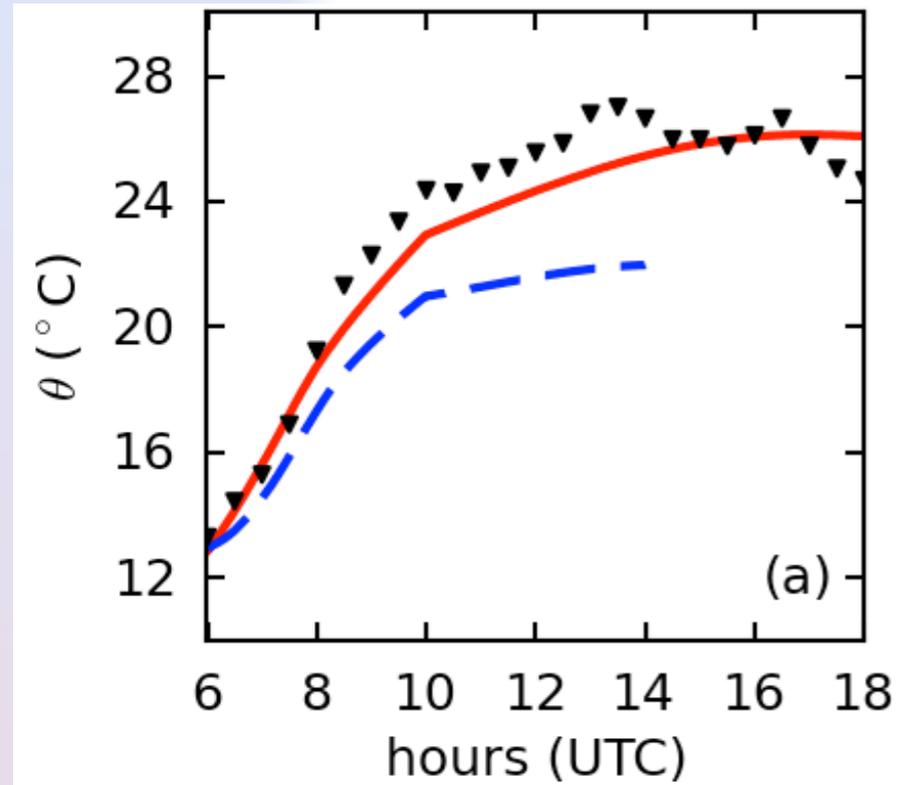
Surface fluxes



Atmospheric variables

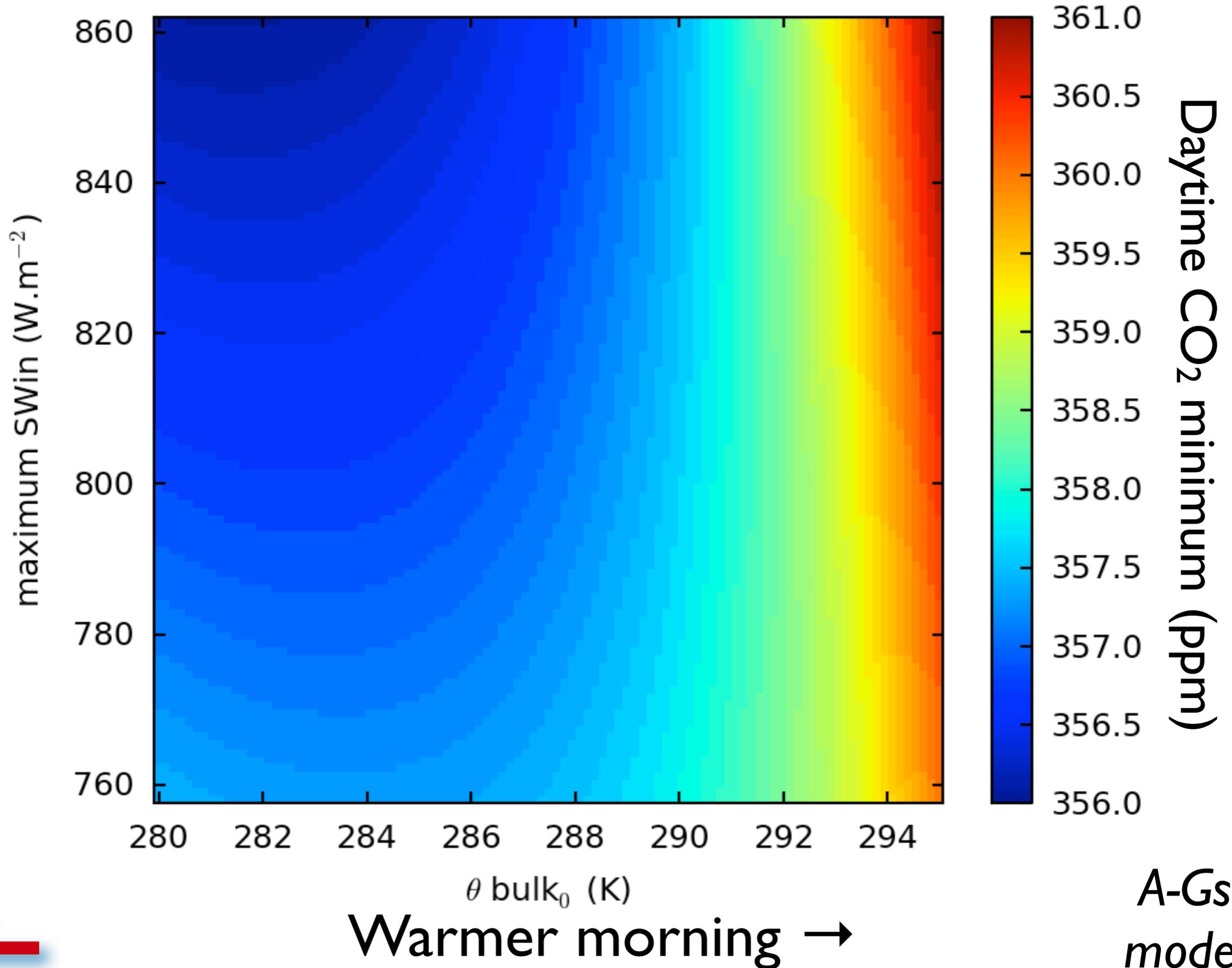


Atmospheric variables



(1) Crop-Atmosphere interactions

Less cloud cover →



(2) CO₂ errors in the PBL

$$C = C_0 \frac{h_0}{h} + C_0^{fa} \left(1 - \frac{h_0}{h}\right) + \frac{\gamma_{CO_2}}{2h} (h - h_0)^2 + \frac{t - t_0}{h} \langle \overline{wCO_2}|_s \rangle$$

$$\langle \overline{wCO_2}|_s \rangle = \frac{1}{t - t_0} \left[Ch - C_0 h_0 - C_0^{fa} (h - h_0) - \frac{\gamma_{CO_2}}{2} (h - h_0)^2 \right].$$

take partial derivatives $\partial C / \partial X$

where X are six **independent**

driver variables:

$$C_0, C_0^{FA}, \gamma, h, h_0, wCO_2$$

A conceptual framework to quantify the influence of convective boundary layer development on carbon dioxide mixing ratios

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(2) CO₂ errors in the PBL

$$C = C_0 \frac{h_0}{h} + C_0^{fa} \left(1 - \frac{h_0}{h}\right) + \frac{\gamma_{co2}}{2h} (h - h_0)^2 + \frac{t - t_0}{h} \langle \overline{wco2}|_s \rangle$$

$$\langle \overline{wco2}|_s \rangle = \frac{1}{t-t_0} \left[Ch - C_0 h_0 - C_0^{fa} (h - h_0) - \frac{\gamma_{co2}}{2} (h - h_0)^2 \right].$$

$$(1) \quad \frac{\partial C}{\partial C_0} = \frac{h_0}{h},$$

$$(2) \quad \frac{\partial C}{\partial h} = \frac{\gamma_c}{2} + \frac{1}{h^2} \left[h_0 (C_0^{FA} - C_0) - \frac{\gamma_c h_0^2}{2} - (t - t_0) \langle \overline{w'c'}|_s \rangle \right]$$



(2) CO₂ errors in the PBL

$$C = C_0 \frac{h_0}{h} + C_0^{fa} \left(1 - \frac{h_0}{h}\right) + \frac{\gamma_{co2}}{2h} (h - h_0)^2 + \frac{t - t_0}{h} \langle \overline{wco2|_s} \rangle$$

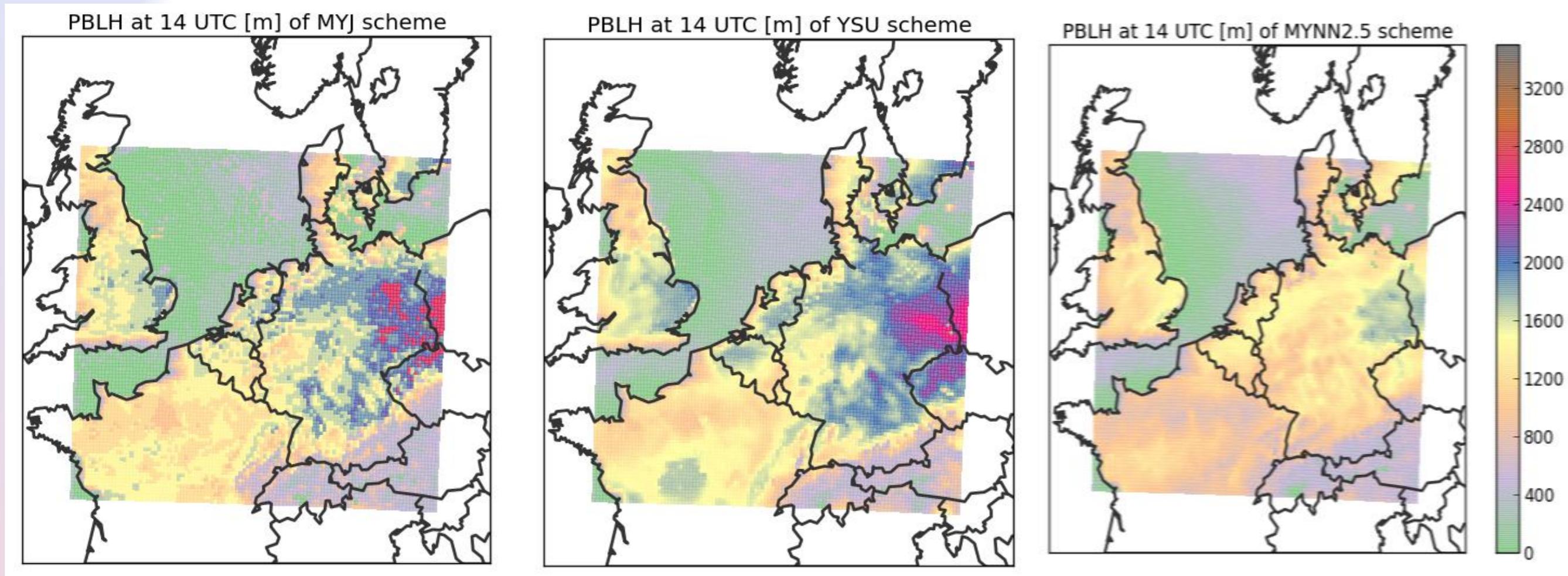
$$\langle \overline{wco2|_s} \rangle = \frac{1}{t-t_0} \left[Ch - C_0 h_0 - C_0^{fa} (h - h_0) - \frac{\gamma_{co2}}{2} (h - h_0)^2 \right].$$

$$(3) \quad \frac{\partial \langle \overline{wco2|_s} \rangle}{\partial h_0} = \frac{1}{t-t_0} \left[C_0^{fa} - C_0 + \gamma_{co2} (h - h_0) \right],$$

$$(4) \quad \frac{\partial \langle \overline{wco2|_s} \rangle}{\partial h} = \frac{1}{t-t_0} \left[C - C_0^{fa} - \gamma_{co2} (h - h_0) \right],$$



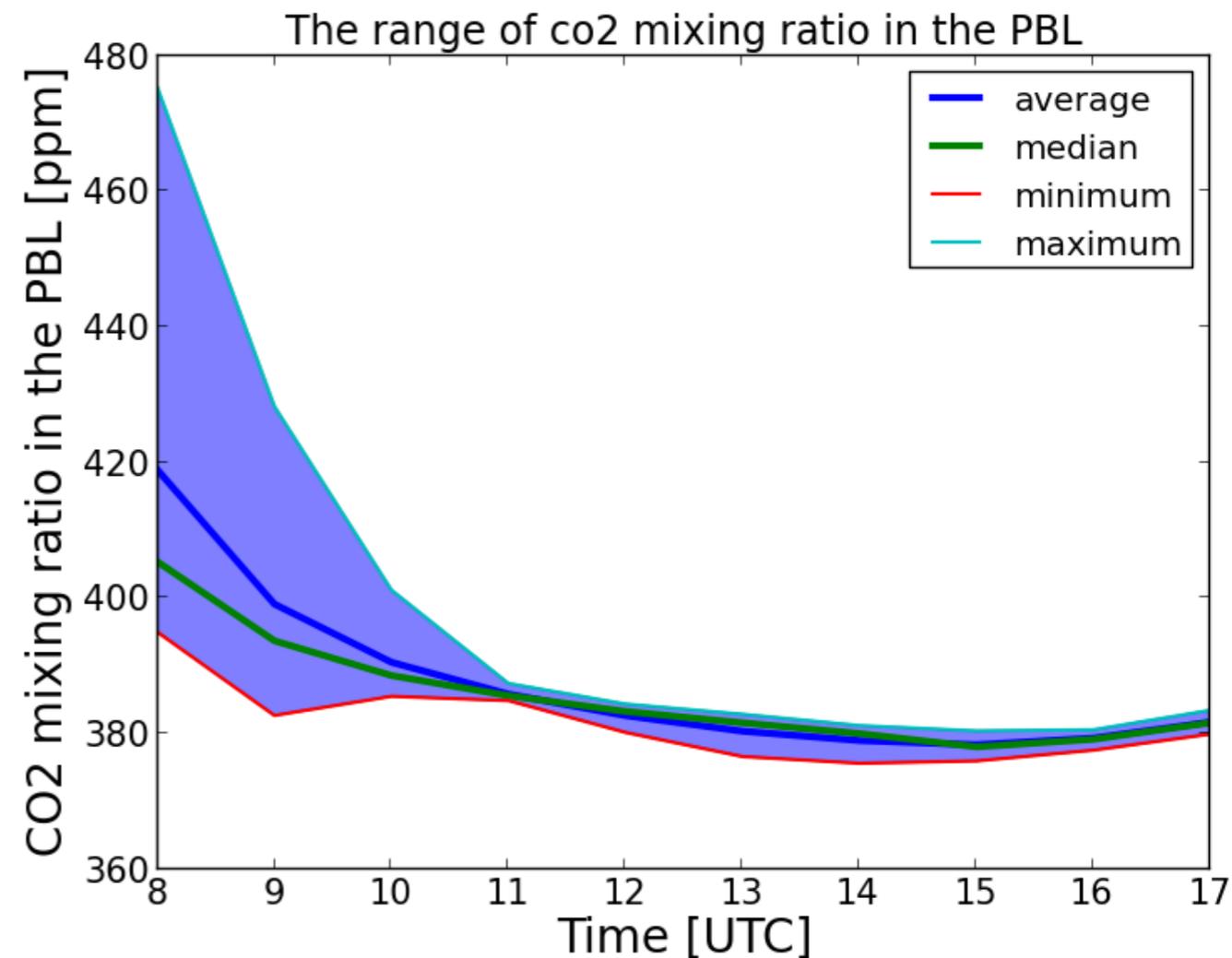
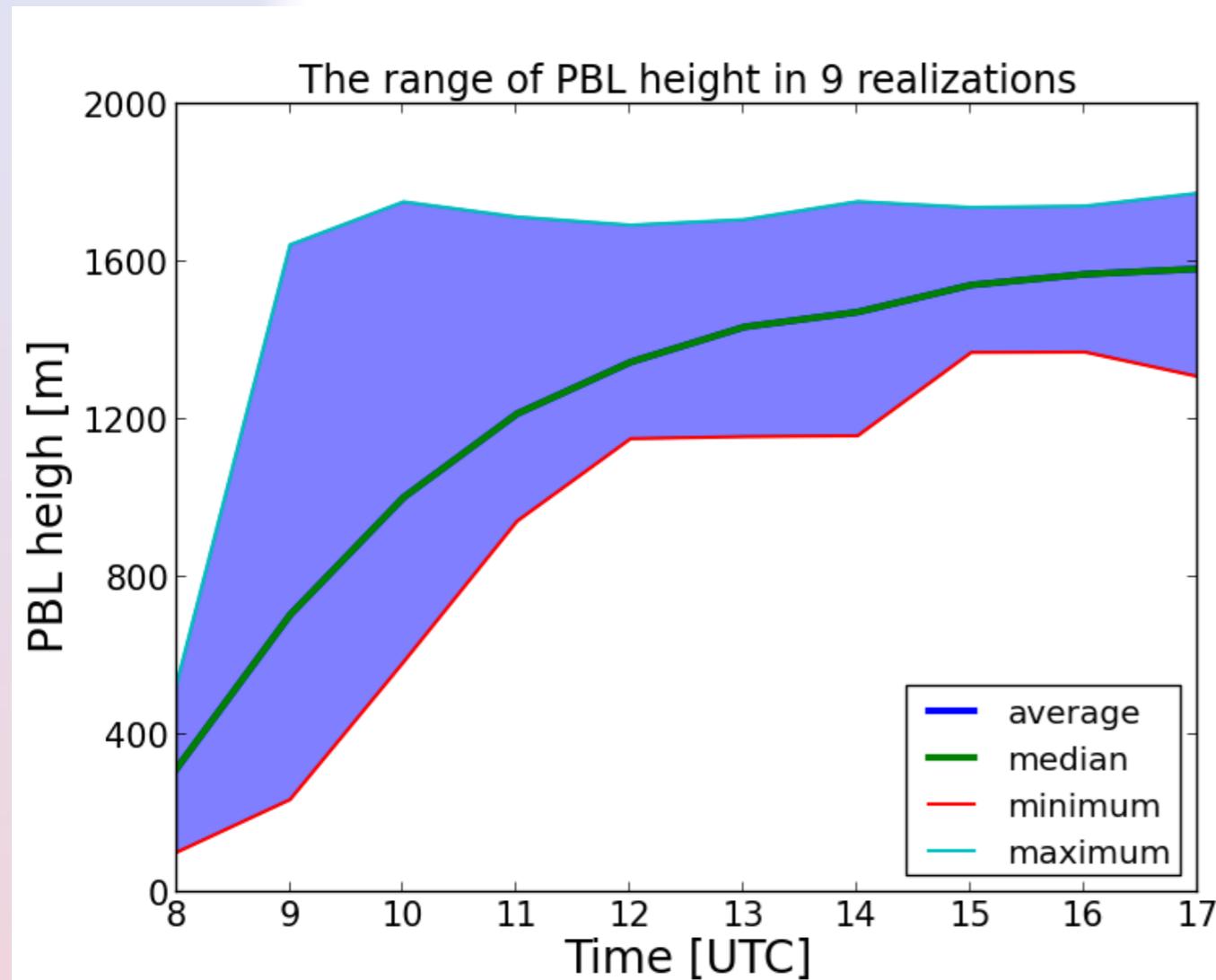
(2) CO₂ errors in the PBL



WRF modeling with three PBL schemes (MYJ, YSU, MYNN2.5), T and light dependent surface CO₂ flux (A-Gs)



Example of PBL heights and CO₂ mole fractions derived with WRF



N = 9 (schemes/methods)

M = 116 (selected mixed-layer cases June)



(2) CO₂ errors in the PBL

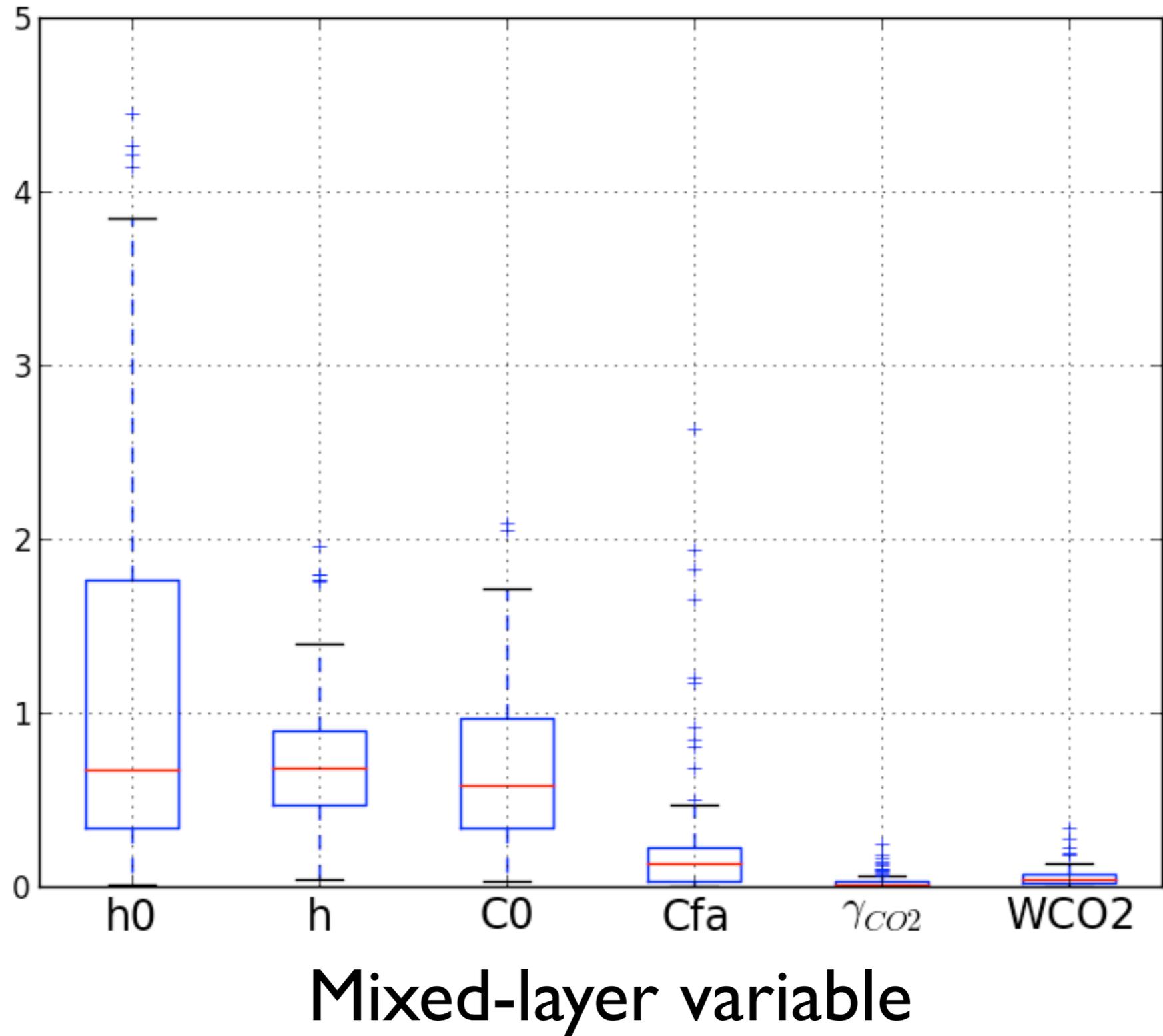
Variable	Error*
h_0	84 m
h	262 m
C_0	2.2 ppm
C_0^{FA}	0.1 ppm
γ_{CO_2}	0.02 ppm/km
$\overline{w'c'}$	7 $\mu\text{g m}^{-2} \text{s}^{-1}$

* = half range of min-max values simulated,
median of 116 cases shown



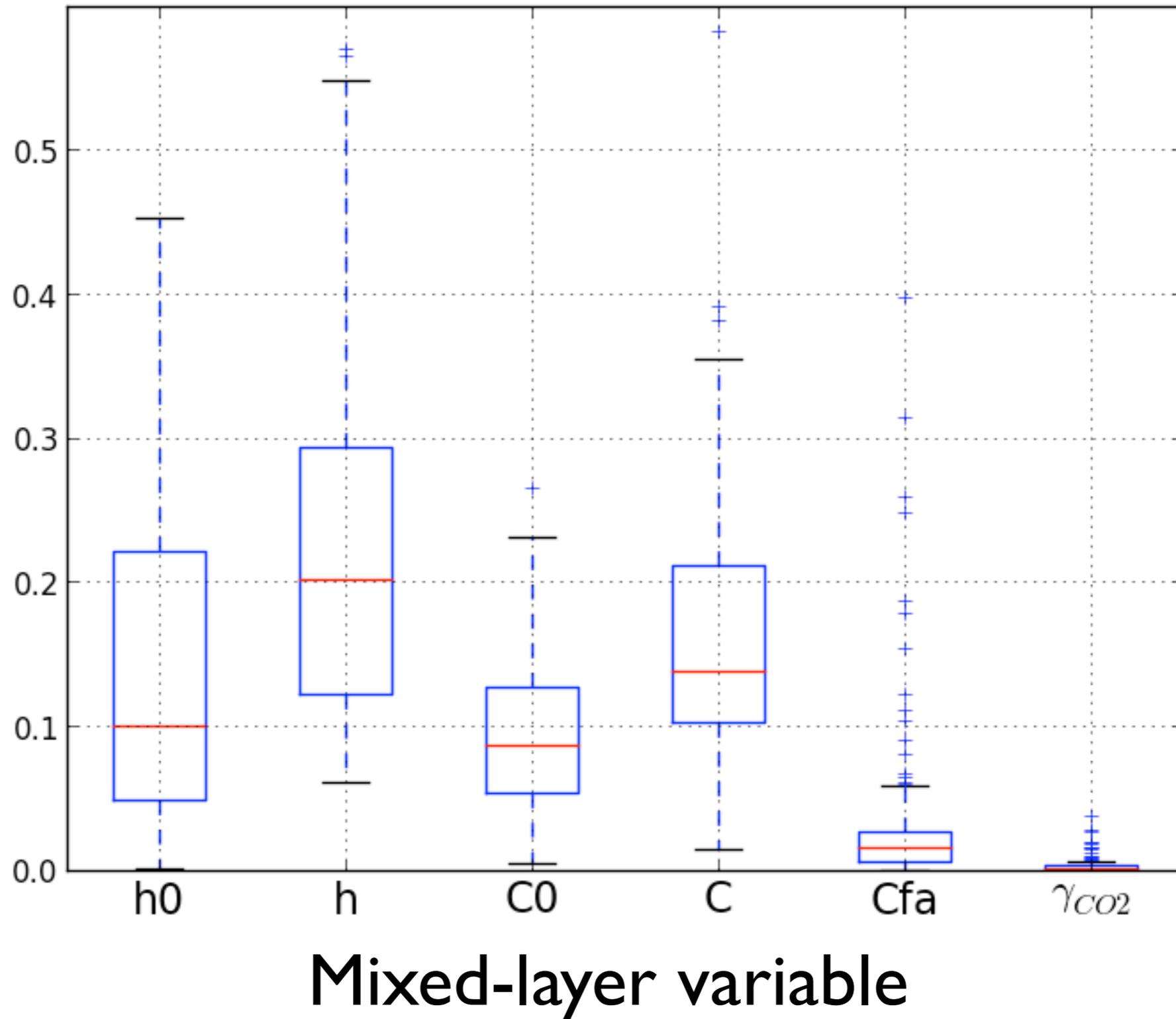
(2) CO₂ errors in the PBL

Mid-day mole fraction
error in CO₂ [ppm]



(2) CO₂ errors in the PBL

Daytime avg flux
error [mg/m²/s]





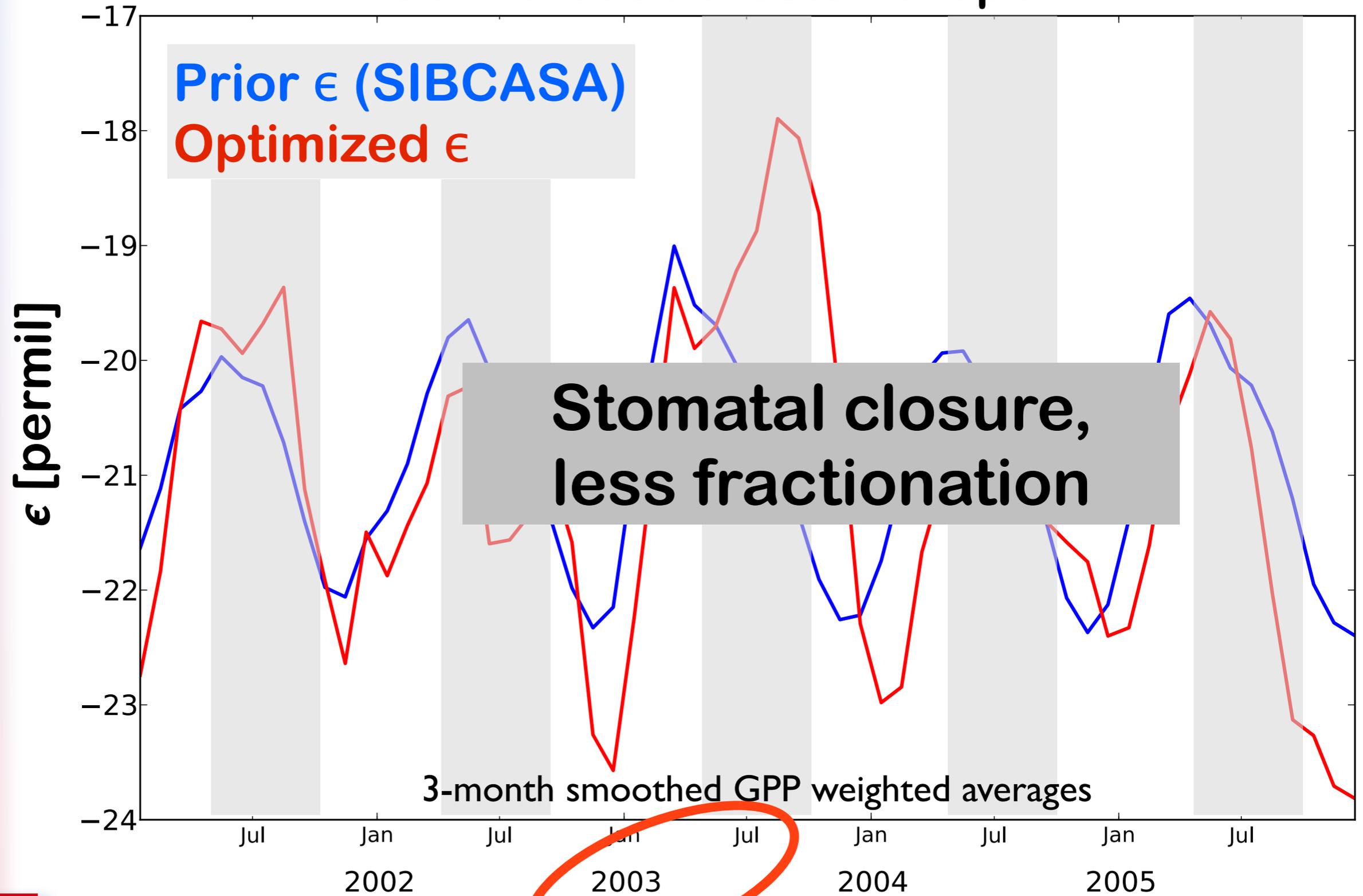
Conclusions

- Coupled carbon-water-energy exchange key to understanding multiple scales
- Dynamics can be a main source of errors in simulated CO₂ mole fractions and estimated surface fluxes
- The effect of local errors is to some degree dampened beyond the synoptic time scale, where main control is bulk ventilation rate
- Increasing role for NWP in understanding carbon cycle behavior, ECMWF has an important role to play



Optimizing discrimination

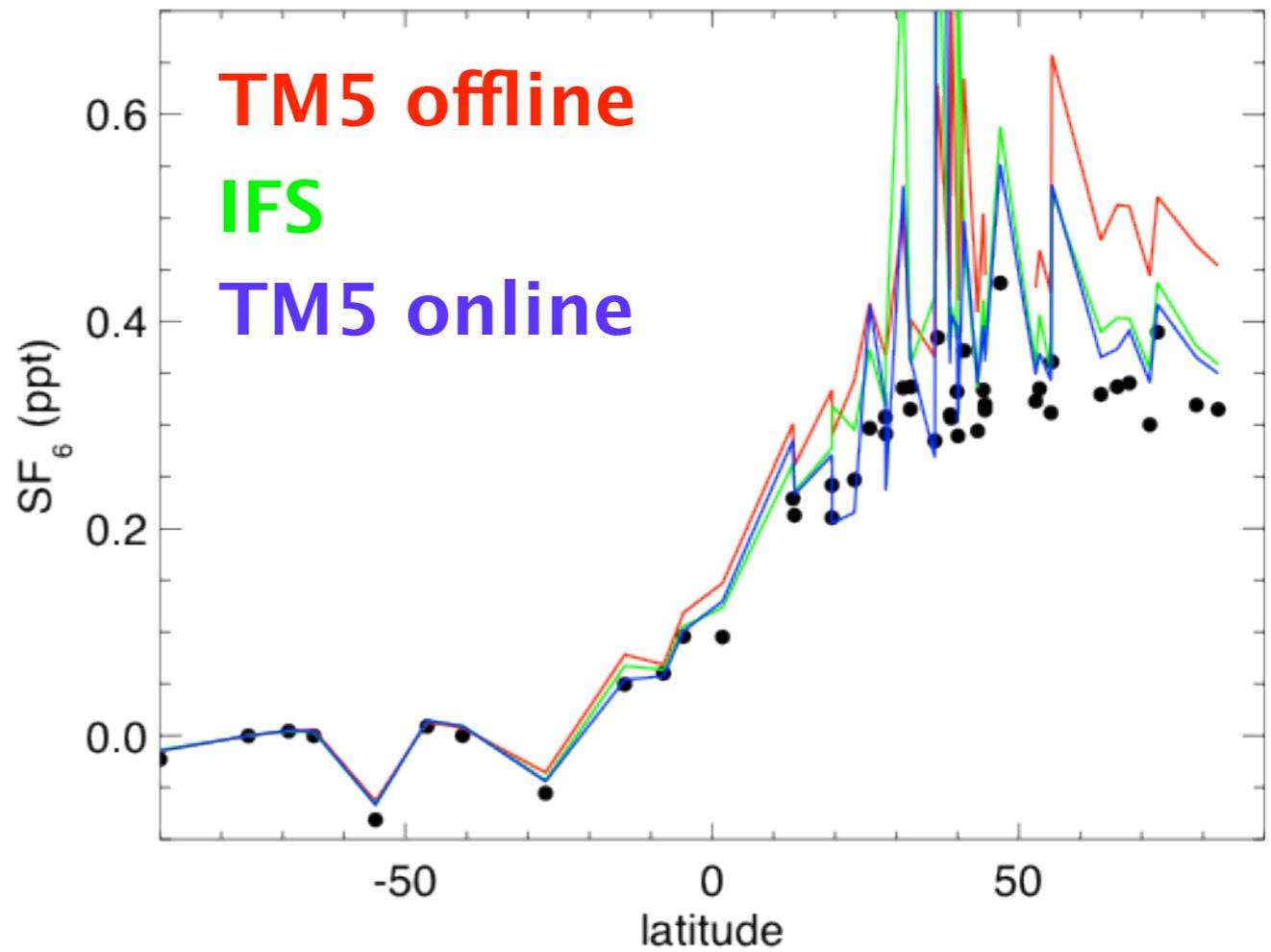
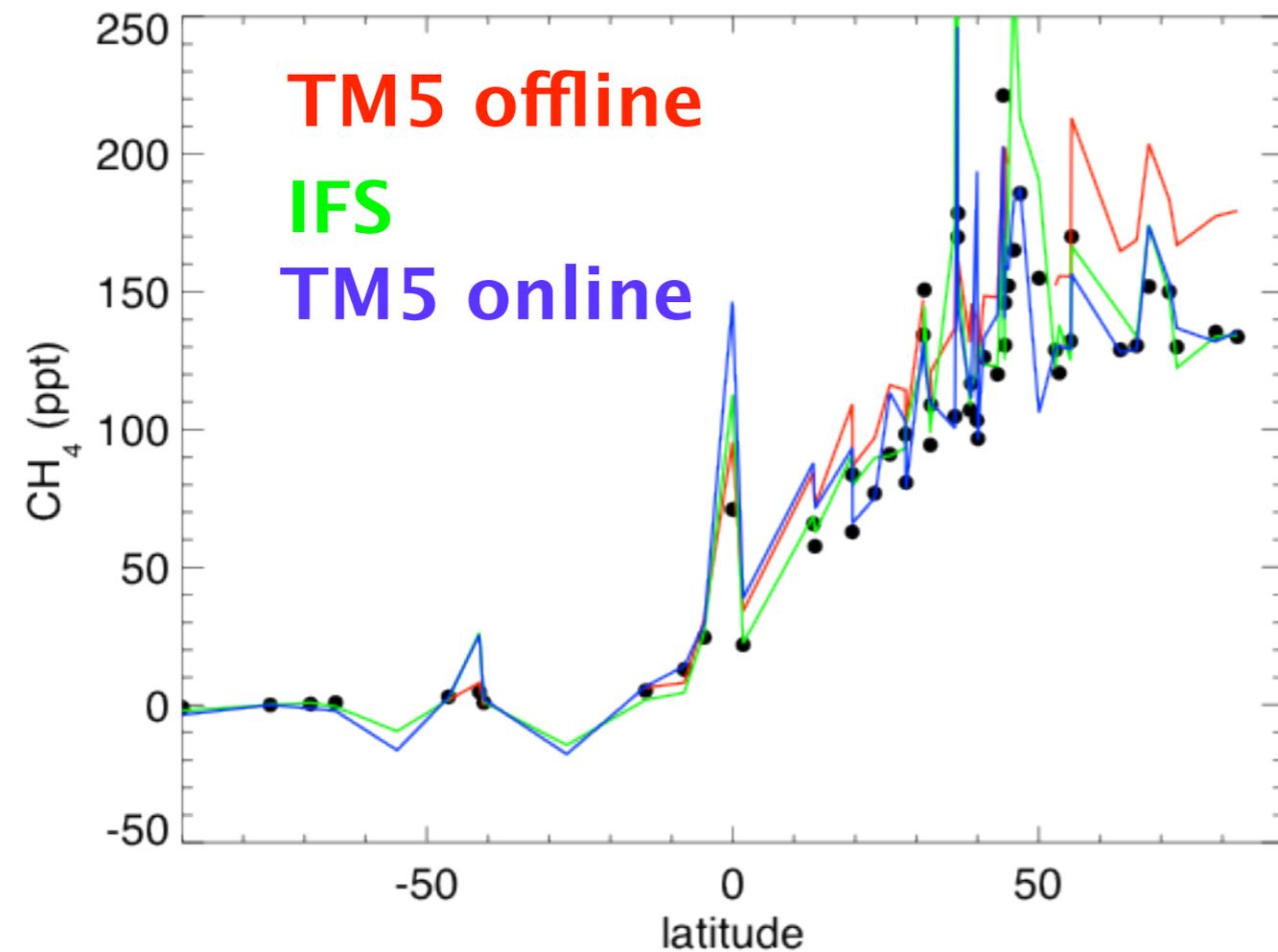
Coniferous Forests Europe



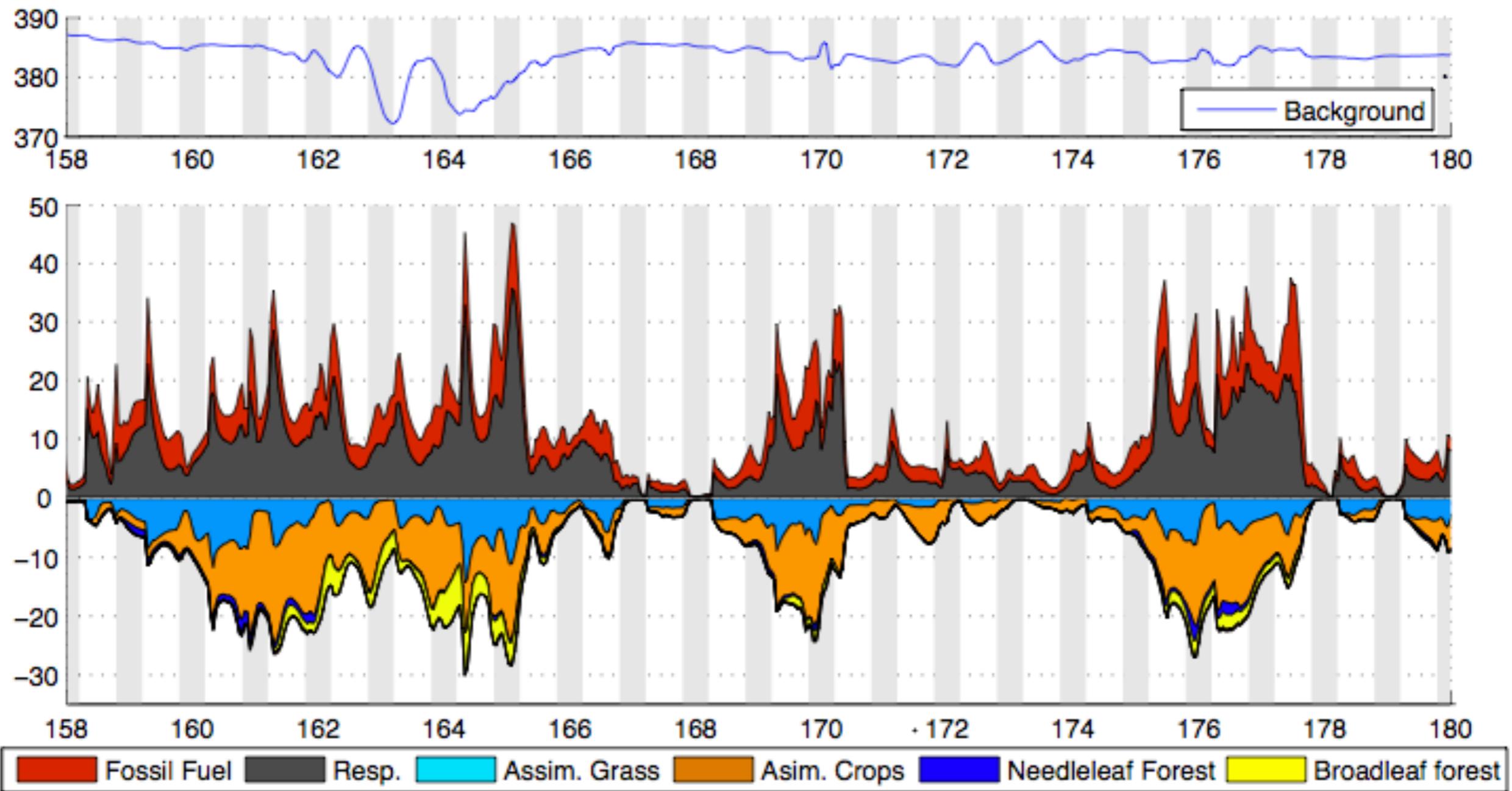
Comparison TM5 'offline', 'online' and IFS

CH₄

SF₆



TM5 online (EC-Earth) performs pretty similar to IFS!

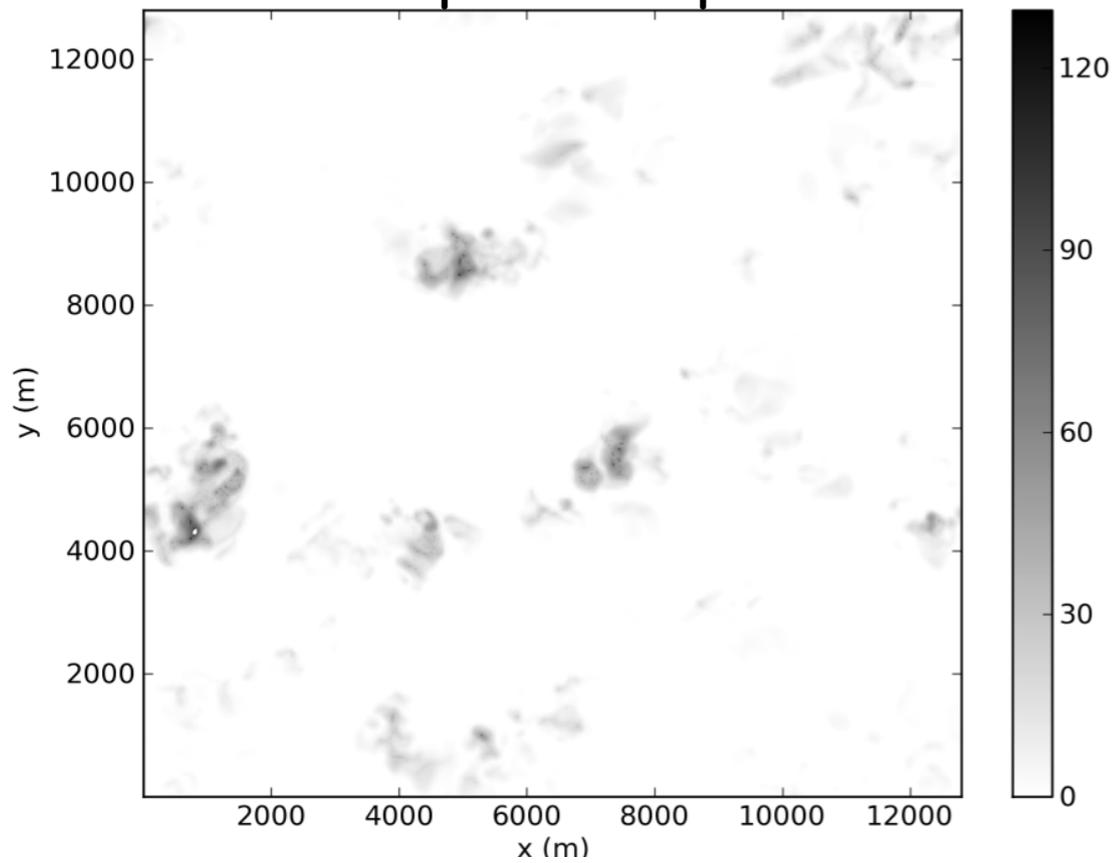


Modelling regional scale surface fluxes, meteorology and CO₂ mixing ratios for the Cabauw tower in the Netherlands

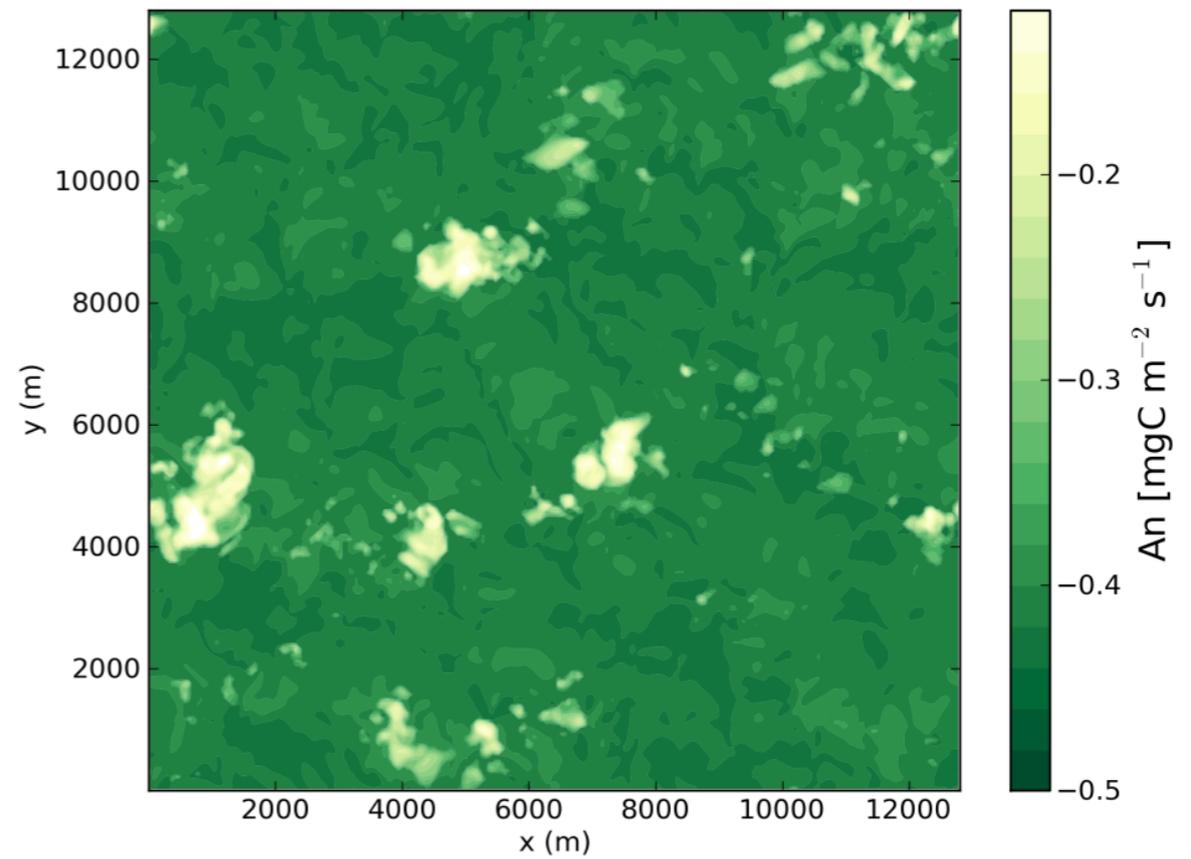
L. F. Tolk¹, W. Peters², A. G. C. A. Meesters¹, M. Groenendijk¹, A. T. Vermeulen³, G. J. Steeneveld², and A. J. Dolman¹



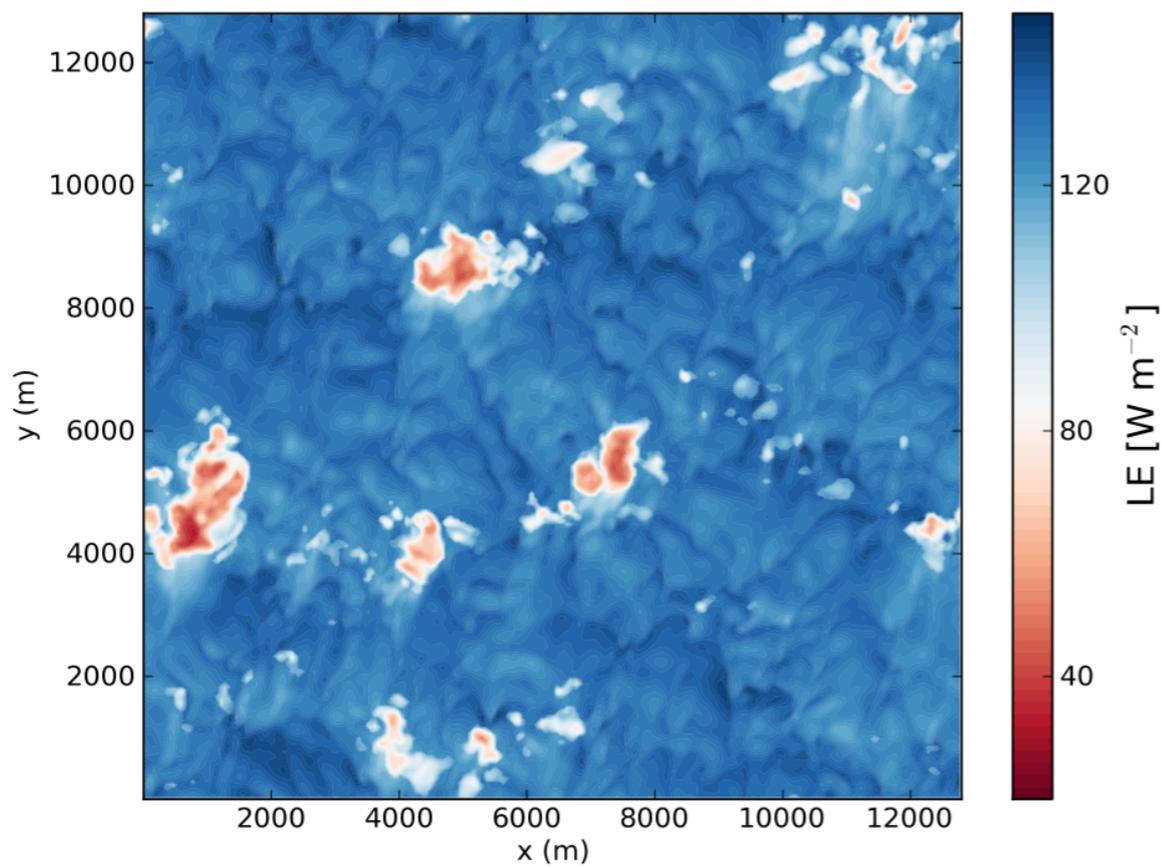
Cloud optical depth



C3 grass photosynthesis



Latent heat



Sensible heat

