



# EARTH SYSTEM RESEARCH LABORATORY

*Serving Society through Science*

## *CarbonTracker*

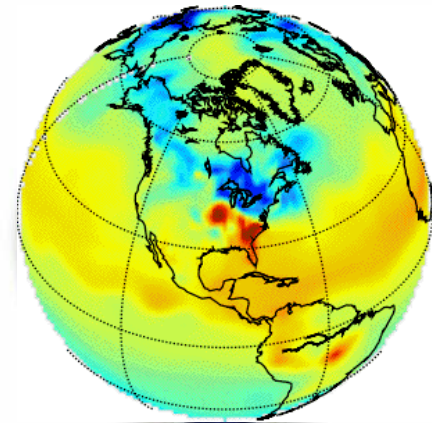
The NOAA *CarbonTracker* team:

Wouter Peters, [Andy Jacobson](#), Ken Masarie, Pieter Tans, John B. Miller, Arlyn Andrews, Colm Sweeney, Tom Conway, Lori Bruhwiler, Gabrielle Pétron, Adam Hirsch

External collaborators:

Doug Worthy, Jim Randerson, Guido van der Werf, Britt Stephens

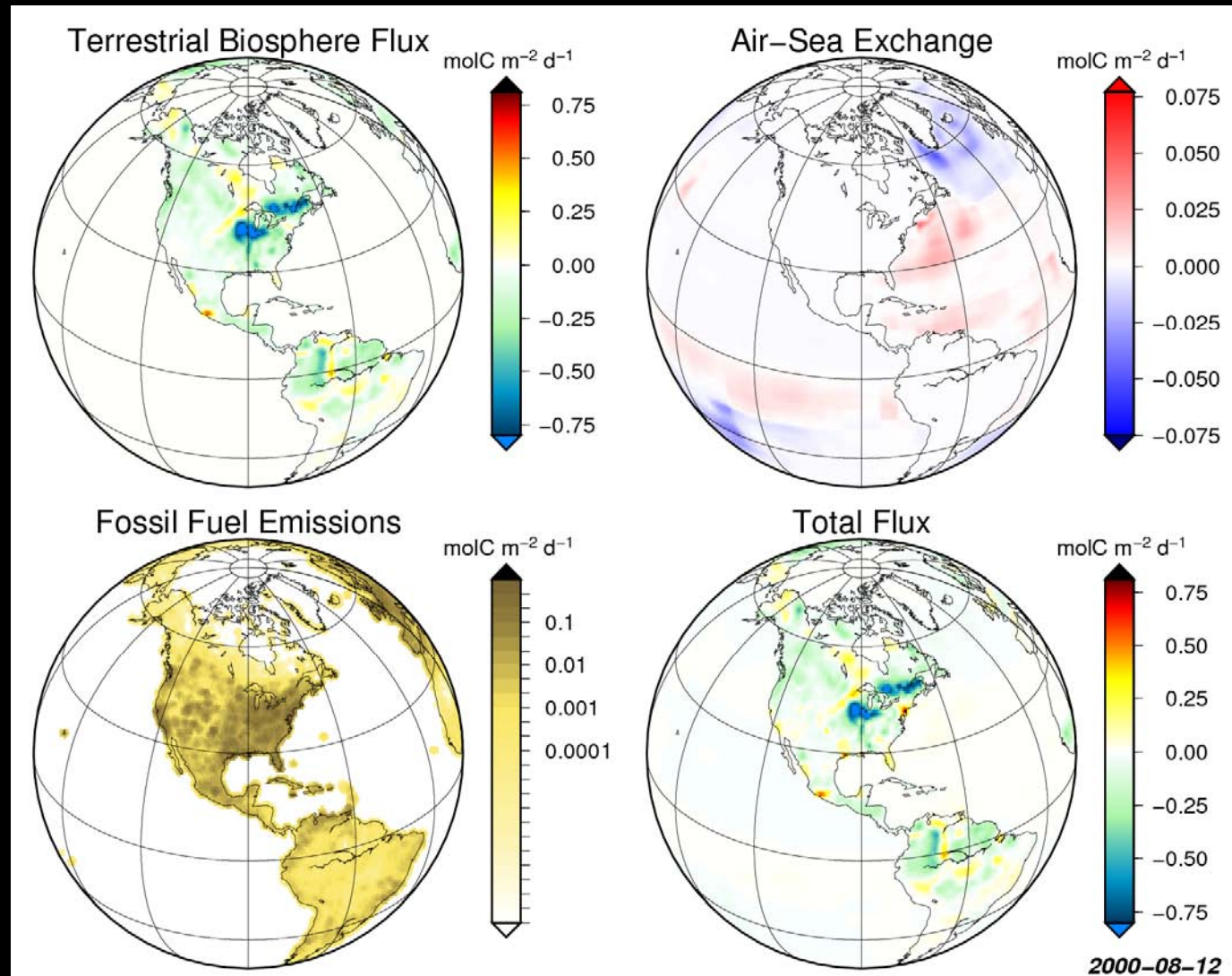
- **What is *CarbonTracker*?**
- **How is it used?**
- **How well does it work?**
- **How will it be improved?**
- **Summary: *Why?***



**ESRL Atmospheric Chemistry Review**  
*January 29-31, 2008 ~ Boulder, Colorado*

# CarbonTracker is:

- A global surface flux inversion
- NOAA's estimate of N. American fluxes
- Our final screen for data quality
- A "reference" solution
- An outreach tool



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PNAS PNAS

## An atmospheric perspective on North American carbon dioxide exchange: CarbonTracker

Wouter Peters\*<sup>1,†</sup>, Andrew R. Jacobson\*<sup>1</sup>, Colm Sweeney\*<sup>1</sup>, Arlyn E. Andrews\*, Thomas J. Conway\*, Kenneth Masarie\*, John B. Miller\*<sup>1</sup>, Lori M. P. Bruhwiler\*, Gabrielle Pétron\*<sup>1</sup>, Adam I. Hirsch\*<sup>1</sup>, Douglas E. J. Worthy<sup>5</sup>, Guido R. van der Werf<sup>1</sup>, James T. Randerson<sup>1</sup>, Paul O. Wennberg\*\*<sup>1</sup>, Maarten C. Krol<sup>1,†</sup>, and Pieter P. Tans\*<sup>1</sup>

\*National Oceanic and Atmospheric Administration Earth System Research Laboratory, 325 Broadway R/GMD1, Boulder, CO 80305; <sup>1</sup>Cooperative Institute for Research in Environmental Sciences, UCB 216, Boulder, CO 80303; <sup>2</sup>Environment Canada, 4905 Dufferin Street, Downsview, ON, Canada M3H 5T4; <sup>3</sup>Faculty of Earth and Life Sciences, Vrije Universiteit, 1081 HV, Amsterdam, The Netherlands; <sup>4</sup>Department of Earth System Science, University of California, Irvine, CA 92697; <sup>5</sup>Division of Engineering and Applied Science and Division of Geological and Planetary Sciences, California Institute of Technology, Pasadena, CA 91125; and <sup>†</sup>Department of Meteorology and Air Quality, Wageningen University and Research Center, 6708 PB, Wageningen, The Netherlands

Communicated by A. R. Ravishankara, National Oceanic and Atmospheric Administration, Boulder, CO, September 27, 2007 (received for review May 23, 2007)

We present an estimate of net CO<sub>2</sub> exchange between the terrestrial biosphere and the atmosphere across North America for every week in the period 2000 through 2005. This estimate is derived from a set of 28,000 CO<sub>2</sub> mole fraction observations in the global atmosphere that are fed into a state-of-the-art data assimilation system for CO<sub>2</sub> called CarbonTracker. By design, the surface fluxes produced in CarbonTracker are consistent with the recent history

In addition, carbon exchange is monitored locally (≈1 km<sup>2</sup>) from a worldwide collection of surface flux measurements in different ecosystems and through periodic inventories of carbon in oceans, forests, and soils. The latter provide long-term constraints on the size of the different carbon pools. Monitoring of the carbon cycle through satellites mostly targets specific processes such as biomass burning, land-use change, or seasonal

### CarbonTracker 2007B: N. America fluxes in PgC yr<sup>-1</sup>.

Year	First Guess NEE	Final NEE	Fires	FF	Total
2000	-0.16 ± 0.89	-0.64 ± 0.65	0.04	1.91	1.31 ± 0.65
2001	-0.16 ± 0.90	-0.45 ± 0.64	0.02	1.92	1.50 ± 0.64
2002	0.03 ± 0.85	<b>-0.17 ± 0.55</b>	0.03	1.92	1.78 ± 0.55
2003	-0.21 ± 0.84	-0.64 ± 0.52	0.03	1.94	1.33 ± 0.52
2004	-0.19 ± 0.90	<b>-0.79 ± 0.48</b>	0.02	1.98	1.20 ± 0.48
2005	-0.20 ± 0.87	<b>-0.76 ± 0.48</b>	0.02	1.99	1.26 ± 0.48
2006	-0.04 ± 0.84	-0.56 ± 0.37	0.02	1.99	1.45 ± 0.37

emissions or to even continue at its present-day magnitude. Moreover, natural emissions themselves might increase as a result of already observable rapid warming in parts of the Arctic (1), where large carbon reservoirs are buried beneath the permafrost. Major national and international programs to study the carbon cycle are therefore underway.

The National Oceanic and Atmospheric Administration's (NOAA's) Earth System Research Laboratory (ESRL) monitors CO<sub>2</sub> in the atmosphere as a contribution to the North American Carbon Program (NACP) (2). Mole fractions of CO<sub>2</sub>

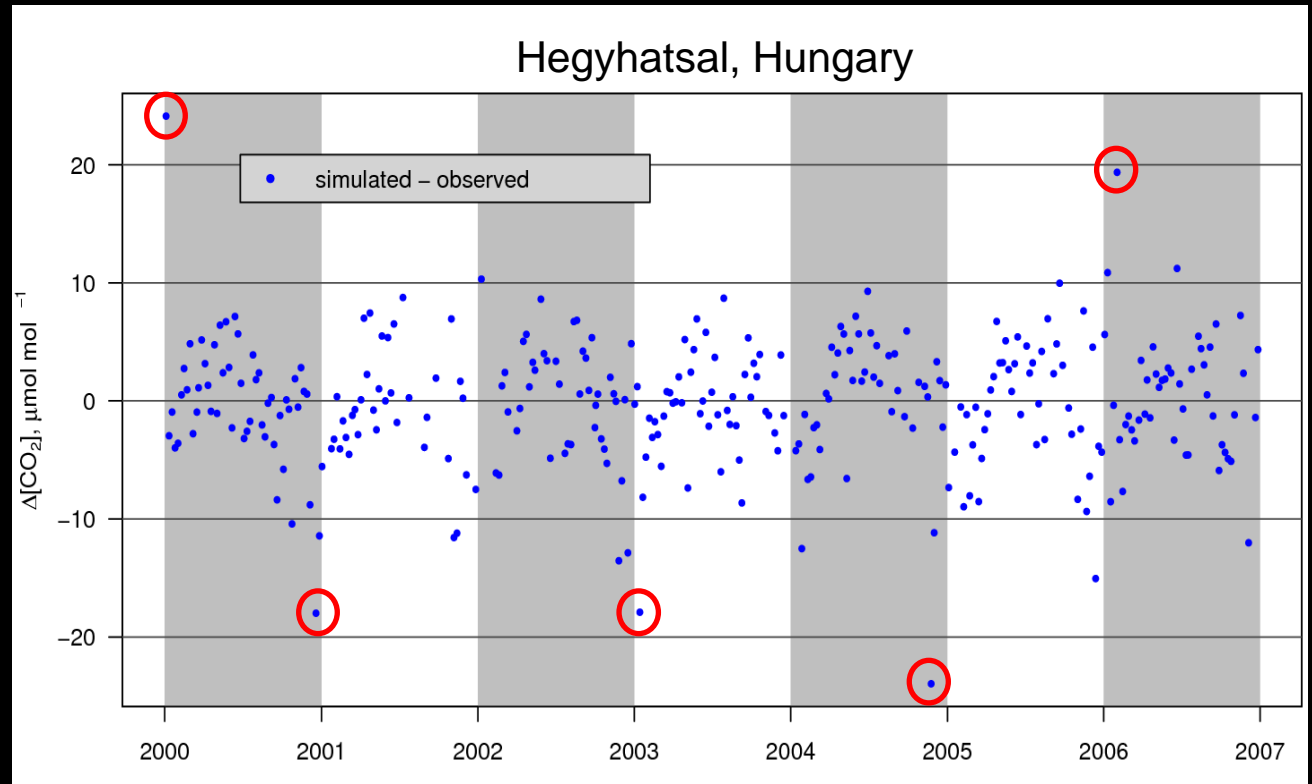
In this work, we introduce CarbonTracker and analyze the recent flux history it produces. We compare its regional estimates for North America with an independent "bottom-up" estimate that is part of the State of the Carbon Cycle Report (SOCCR) (8). This document, created as part of the U.S.

Author contributions: P.P.T. designed research; C.S., A.E.A., T.J.C., D.E.J.W., G.R.v.d.W., J.T.R., and P.O.W. contributed data; A.R.J., K.M., J.B.M., L.M.P.B., G.P., A.I.H., and M.C.K. performed research; and W.P. wrote the paper.

The authors declare no conflict of interest.

# CarbonTracker is:

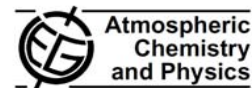
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www.atmos-chem-phys.net/7/4249/2007/  
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## First direct observation of the atmospheric CO<sub>2</sub> year-to-year increase from space

M. Buchwitz, O. Schneising, J. P. Burrows, H. Bovensmann, M. Reuter, and J. Notholt  
Institute of Environmental Physics (IUP), University of Bremen FB1, Bremen, Germany

Received: 13 April 2007 – Published in Atmos. Chem. Phys. Discuss.: 16 May 2007  
Revised: 19 July 2007 – Accepted: 25 July 2007 – Published: 20 August 2007

**Abstract.** The reliable prediction of future atmospheric concentrations and associated global climate change requires an adequate understanding of the CO<sub>2</sub> sources and sinks and the sparseness of the existing surface measurement network. The retrieval of CO<sub>2</sub> total vertical column from satellite observations is predicted to improve our knowledge about the global distribution of surface fluxes. The retrieval of CO<sub>2</sub> total vertical column from satellite observations is predicted to improve our knowledge about the global distribution of surface fluxes. Such an application however requires very accurate and precise measurements. We report on retrievals of the column-averaged CO<sub>2</sub> dry air mole fraction, denoted as XCO<sub>2</sub>, from the near-infrared nadir spectral radiance and solar-induced fluorescence measurements of the SCIAMACHY satellite instrument between 2003 and 2005. We focus on northern hemisphere large scale CO<sub>2</sub> features such as the CO<sub>2</sub> seasonal cycle and show - for the first time - that the atmospheric increase of CO<sub>2</sub> can be directly observed using satellite measurements of the CO<sub>2</sub> total column. The satellite retrievals are compared with global XCO<sub>2</sub> obtained from NOAA's CO<sub>2</sub> assimilation system CarbonTracker taking into account the spatio-temporal sampling and altitude sensitivity of the satellite data. We show that the measured CO<sub>2</sub> year-to-year increase agrees within about 1 ppm/year with CarbonTracker. We also show that the latitude dependent amplitude of the northern hemispheric CO<sub>2</sub> seasonal cycle agrees with CarbonTracker within about 2 ppm with the retrieved amplitude being systematically larger. The analysis demonstrates that it is possible using satellite measurements of the CO<sub>2</sub> total column to retrieve information on the atmospheric CO<sub>2</sub> on the level of a few parts per million.

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eral assumptions related to the required smoothness, the initial conditions, and the global flux field. Synthetic inverse modeling studies have suggested that satellite measurements of the column-averaged CO<sub>2</sub> dry air mole fraction, XCO<sub>2</sub>, as possible using nadir measurements in the near-infrared spectral region, have the potential to significantly improve the determination of source/sink distributions of CO<sub>2</sub> (Rayner and O'Brien, 2001; Houweling et al., 2004). This results primarily from the large amounts of data that satellites produce, but also because nadir satellite remote sensing measurements in the near-infrared spectral region can observe the CO<sub>2</sub> molecules in the entire air column. As a result vertical transport modeling errors are less critical compared to inversions based on in-situ observations only.

Correspondence to: M. Buchwitz  
(michael.buchwitz@iup.physik.uni-bremen.de)



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From: Chris Measures <chrism@soest.hawaii.edu>  
To: carbontracker.team@noaa.gov  
Subject: Re: CarbonTracker updated: new release  
Created: 12/21/2007 19:30:04

Dear Pieter et al:

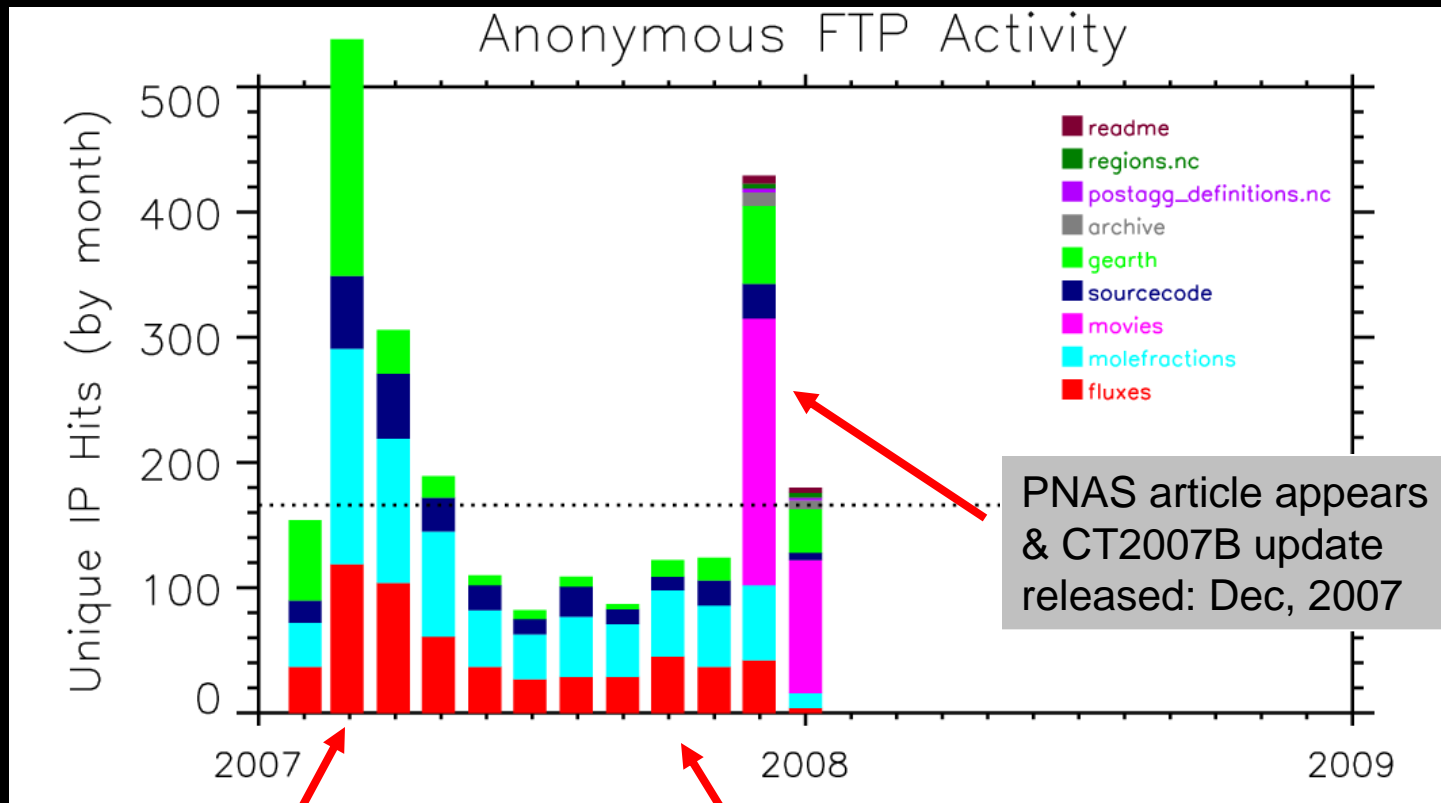
This is really great, thank you for putting this together. I will certainly be using your figures and explanations in the lectures I give to my undergraduates about the CO<sub>2</sub> system. They really want to know the facts and the most recent data are always of great interest to young people since it conveys the immediacy of the problem. I had found it increasingly difficult to get hold of some of the most recent basic information over the last few years, this web resource has made it much easier.

I am particularly happy to get the Mauna Loa data through 2006.

Thanks for facilitating teaching as well as research,

Cheers, Chris Measures  
Oceanography, University of Hawaii

# How is *CarbonTracker* used?



First release,  
February 2007

“pre-AGU bounce”,  
Nov-Dec 2007

# How is *CarbonTracker* used?

## ***Collaborations***

### ***CarbonTracker* for other regions**

- Europe - *Wageningen Univ.*
- Asia - *Korean Met Agency*
- South America - *CPTEC, Brazil and LBA, NASA*

### **Regional inversions**

- North America (with U. Michigan)
- Africa (with NASA's ACE-2 project)
- Japan (with Osaka University)

### **Satellite missions**

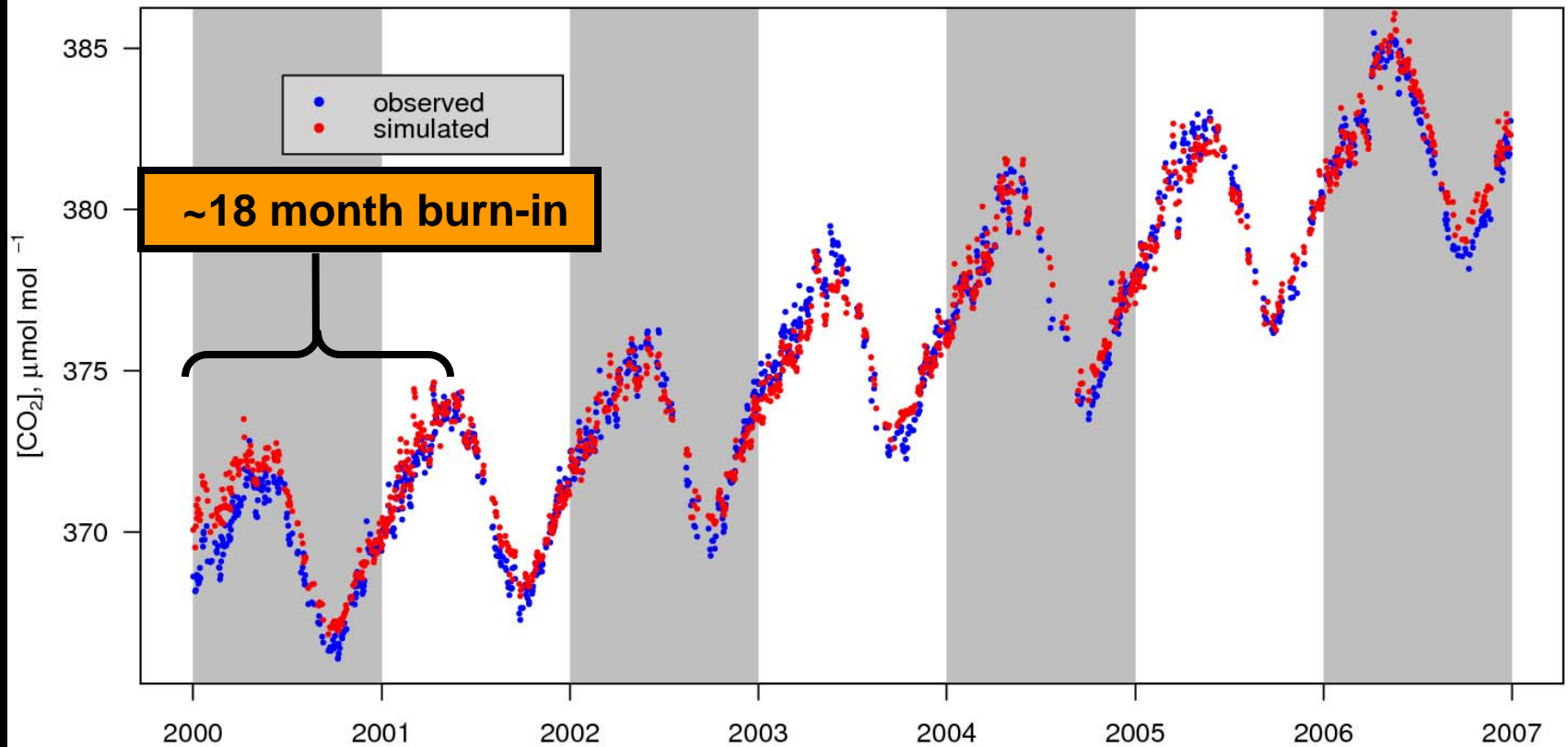
- Ongoing comparison with TCCON network
- CSU OCO inversion
- SCIAMACHY methane and CO<sub>2</sub>

### **NACP, Ameriflux, Canadian Flux net**



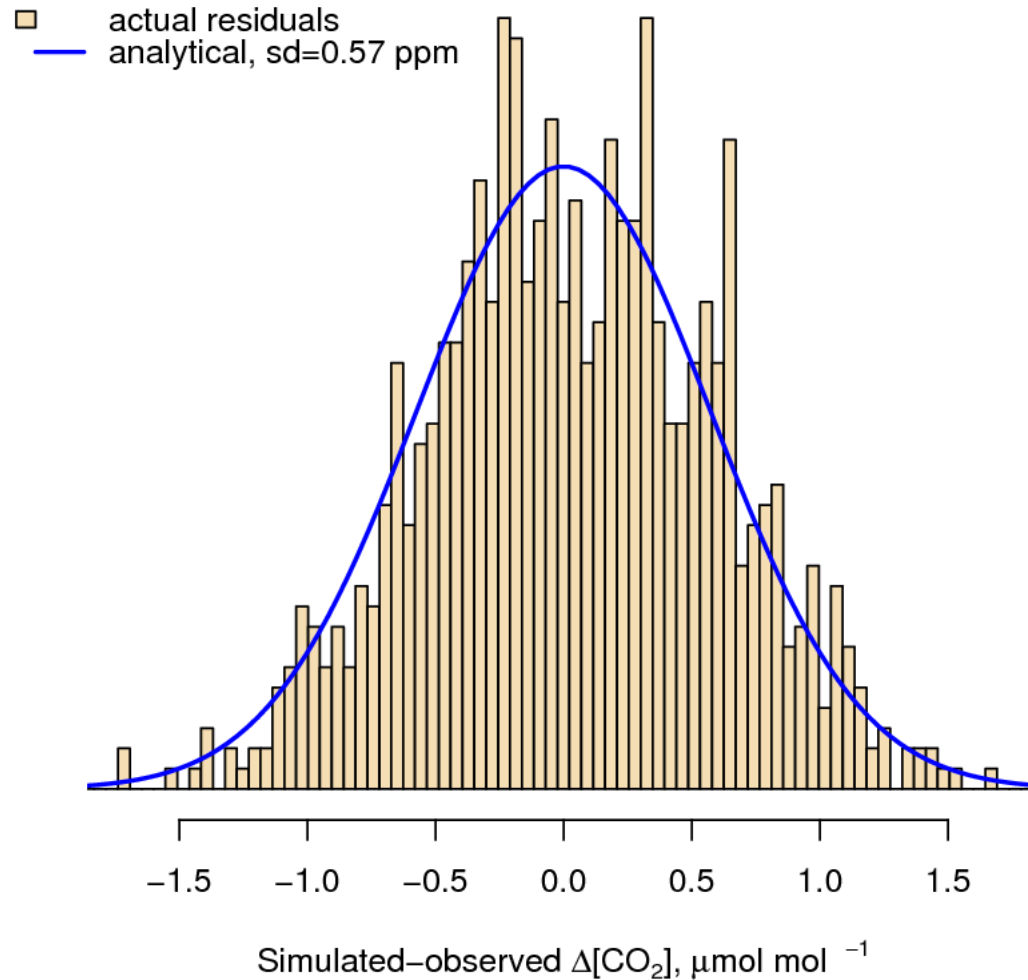
# How well does *CarbonTracker* work?

Mauna Loa, Hawaii - continuous



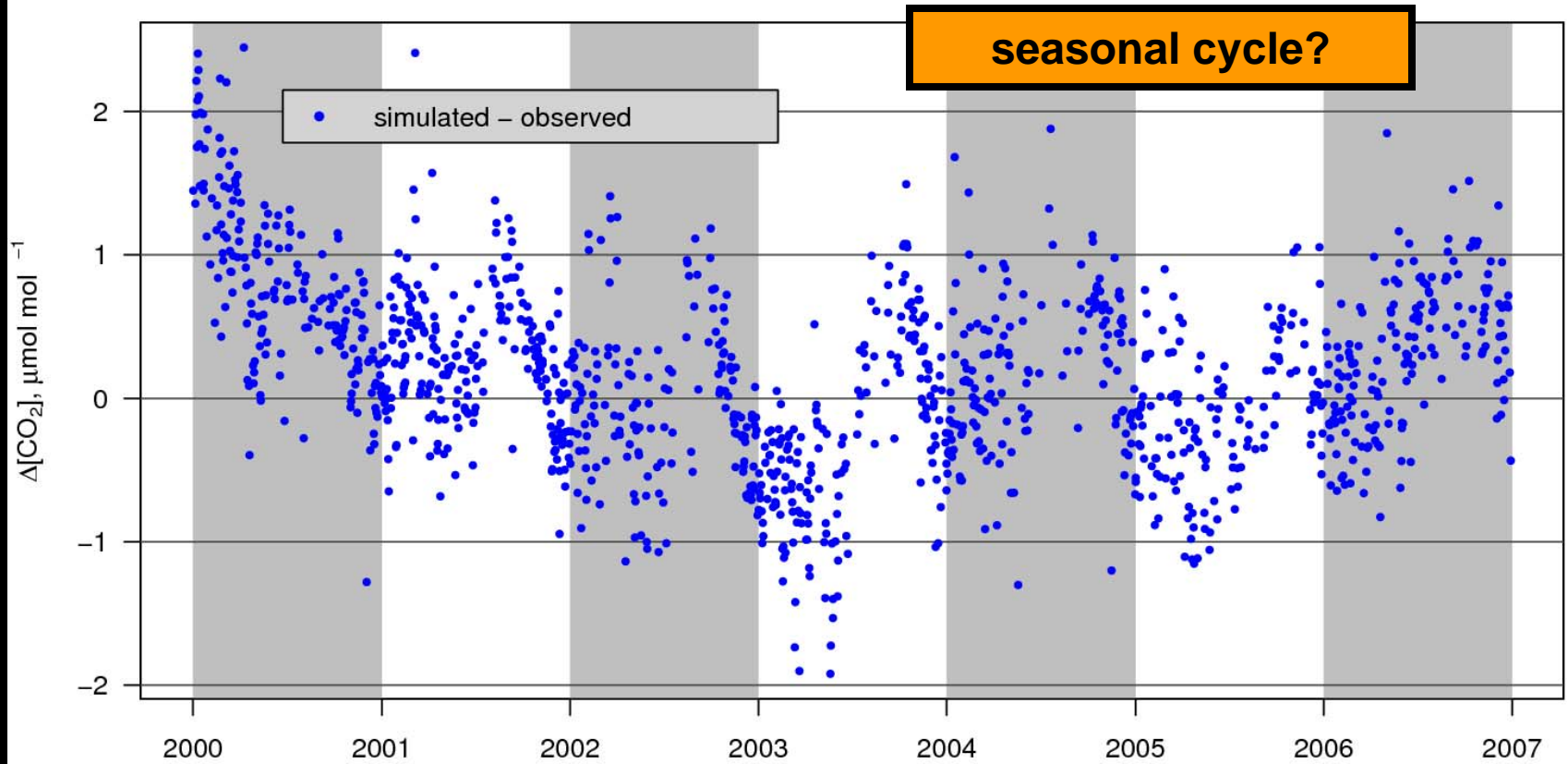
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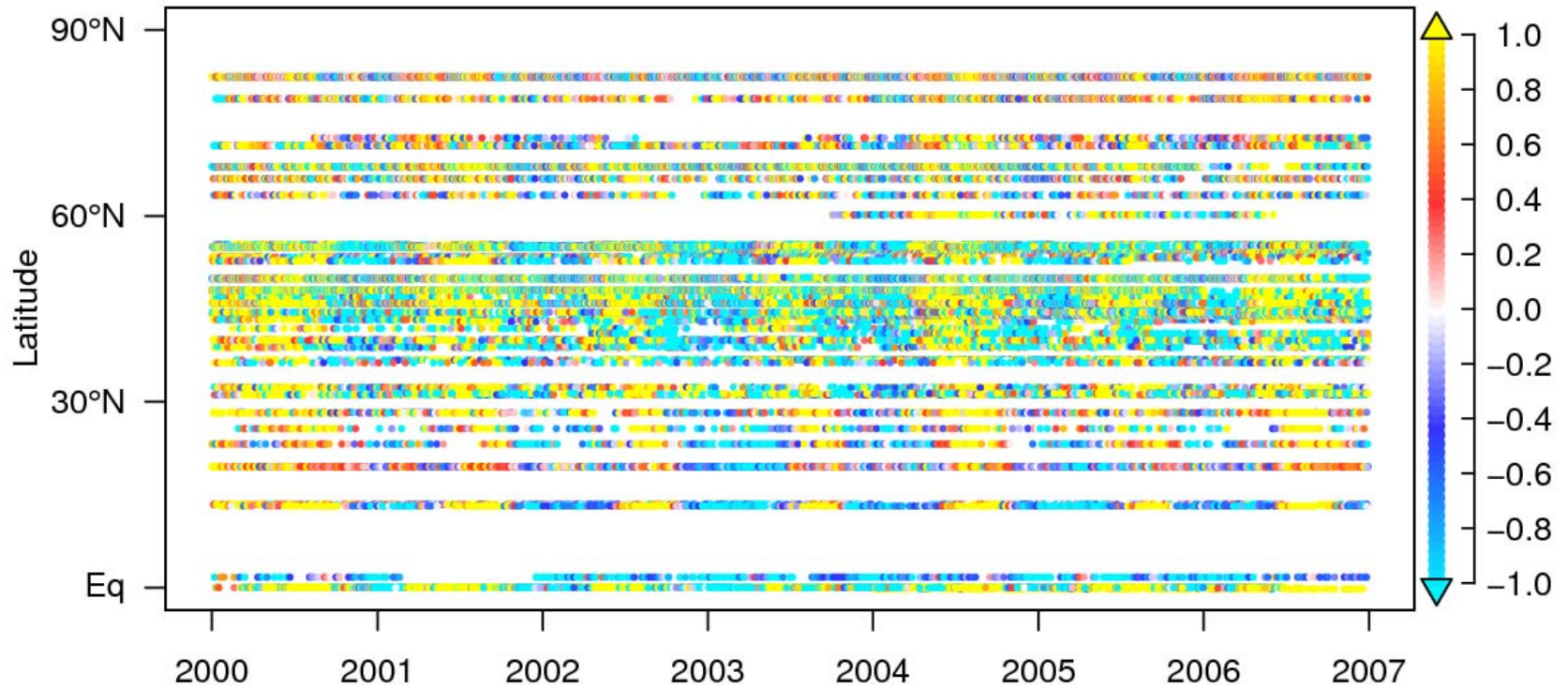
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# How well does *CarbonTracker* work?

CT07B N. Hemisphere residuals, (simulated–observed),  $\mu\text{mol mol}^{-1}$

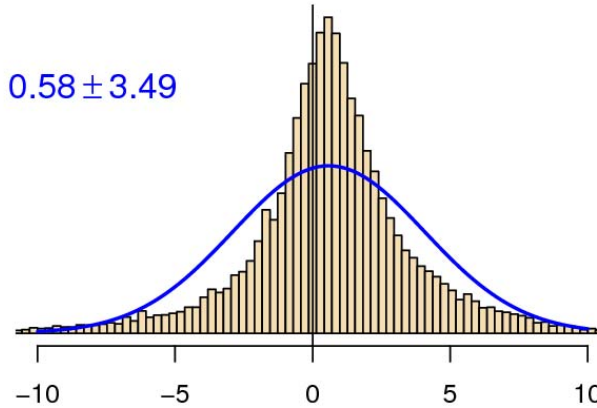


# How well does *CarbonTracker* work?

Model biased high in summer  
too diffusive?  
too little uptake?

NH "Summer" (Jun–Sep) residuals

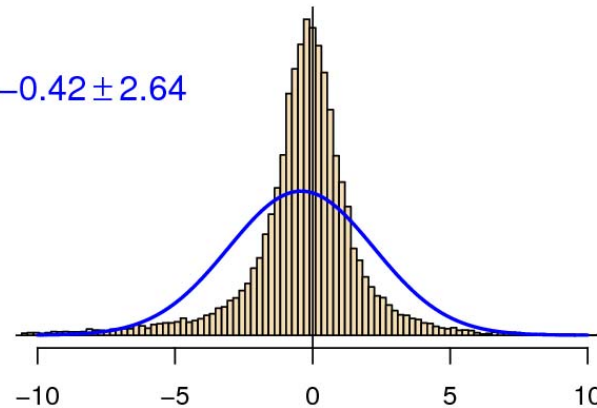
$0.58 \pm 3.49$



Simulated-observed  $\Delta[\text{CO}_2]$ ,  $\mu\text{mol mol}^{-1}$

NH "Winter" (Nov–Apr) residuals

$-0.42 \pm 2.64$



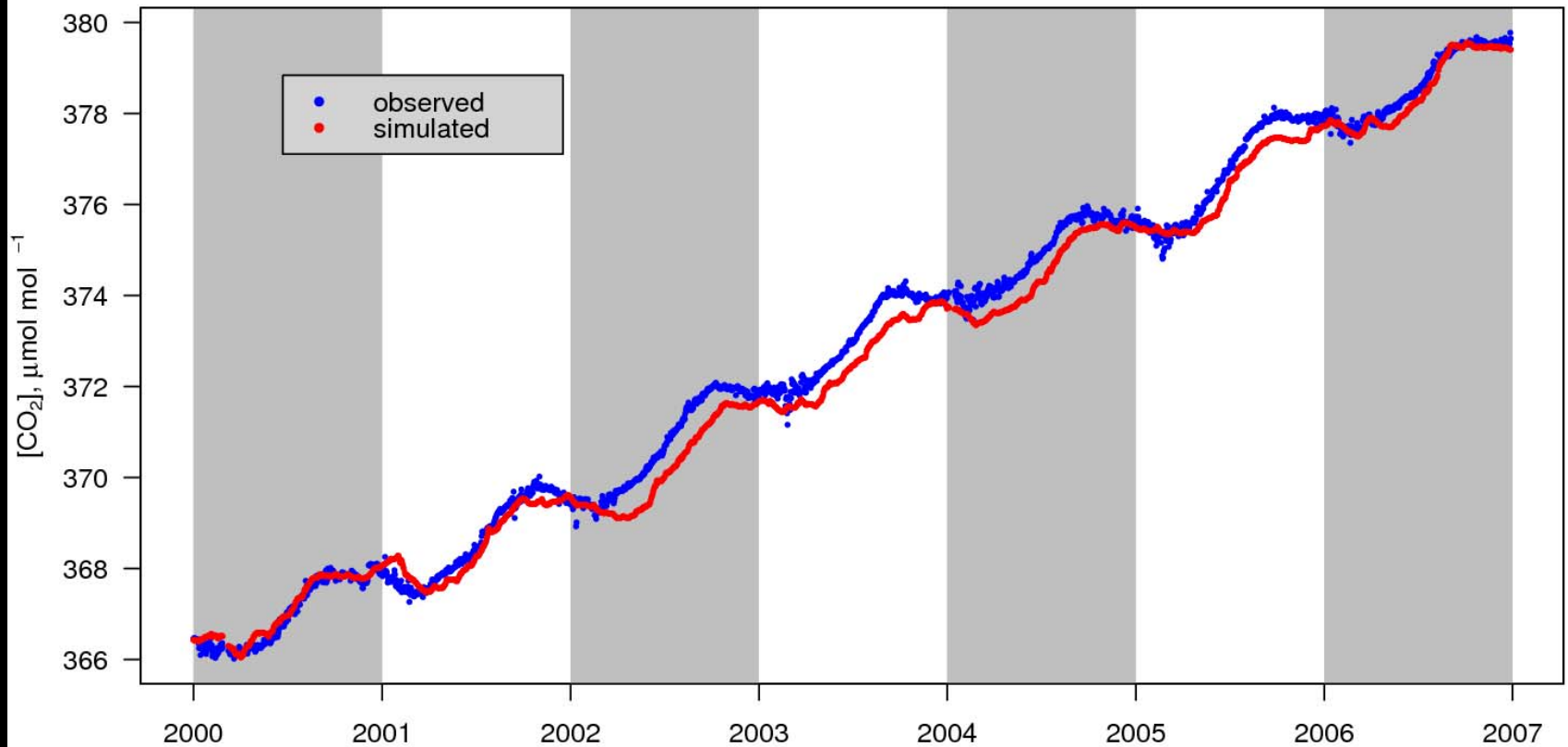
Simulated-observed  $\Delta[\text{CO}_2]$ ,  $\mu\text{mol mol}^{-1}$

Leptokurtic:  
distribution  
dominated by  
big outliers

Model biased low in winter  
too diffusive?  
too little outgassing?

# How well does *CarbonTracker* work?

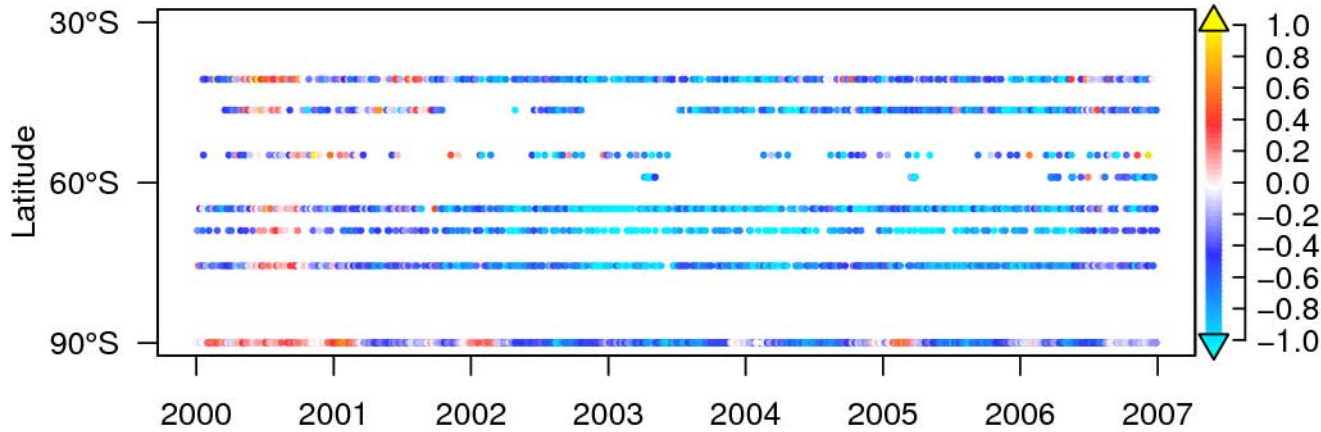
South Pole - continuous



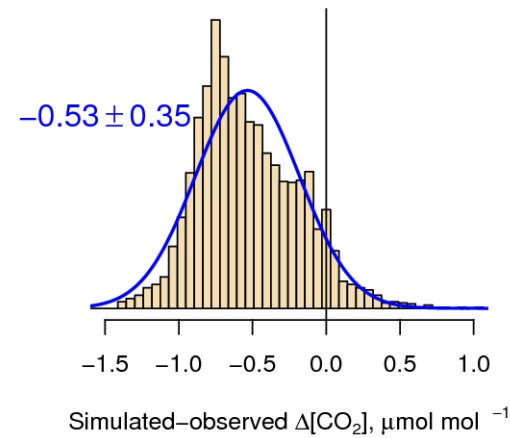


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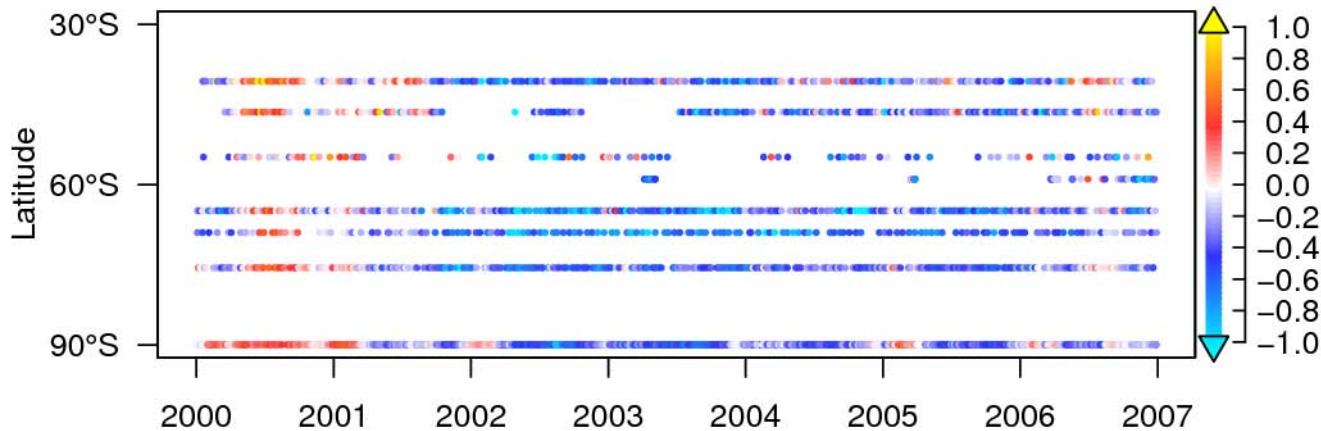
Takahashi/CT07 residuals (simulated-observed),  $\mu\text{mol mol}^{-1}$



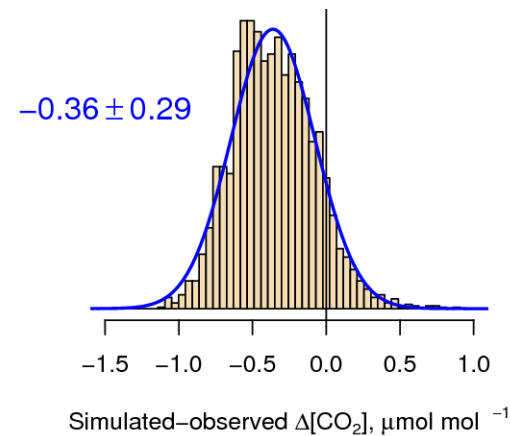
CT07A post burn-in residuals, S of 30°S



OIF/CT07B residuals, (simulated-observed),  $\mu\text{mol mol}^{-1}$

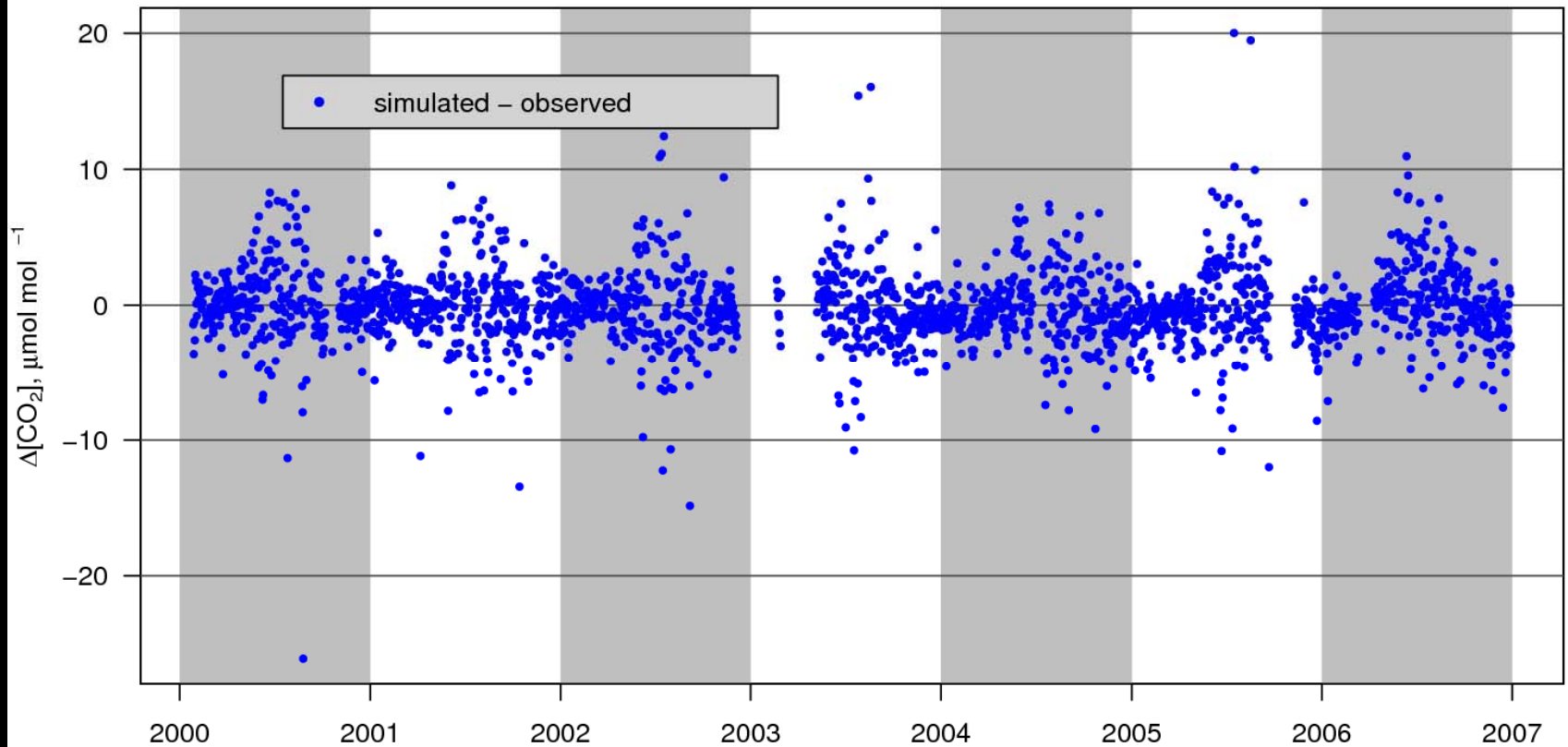


CT07B post burn-in residuals, S of 30°S



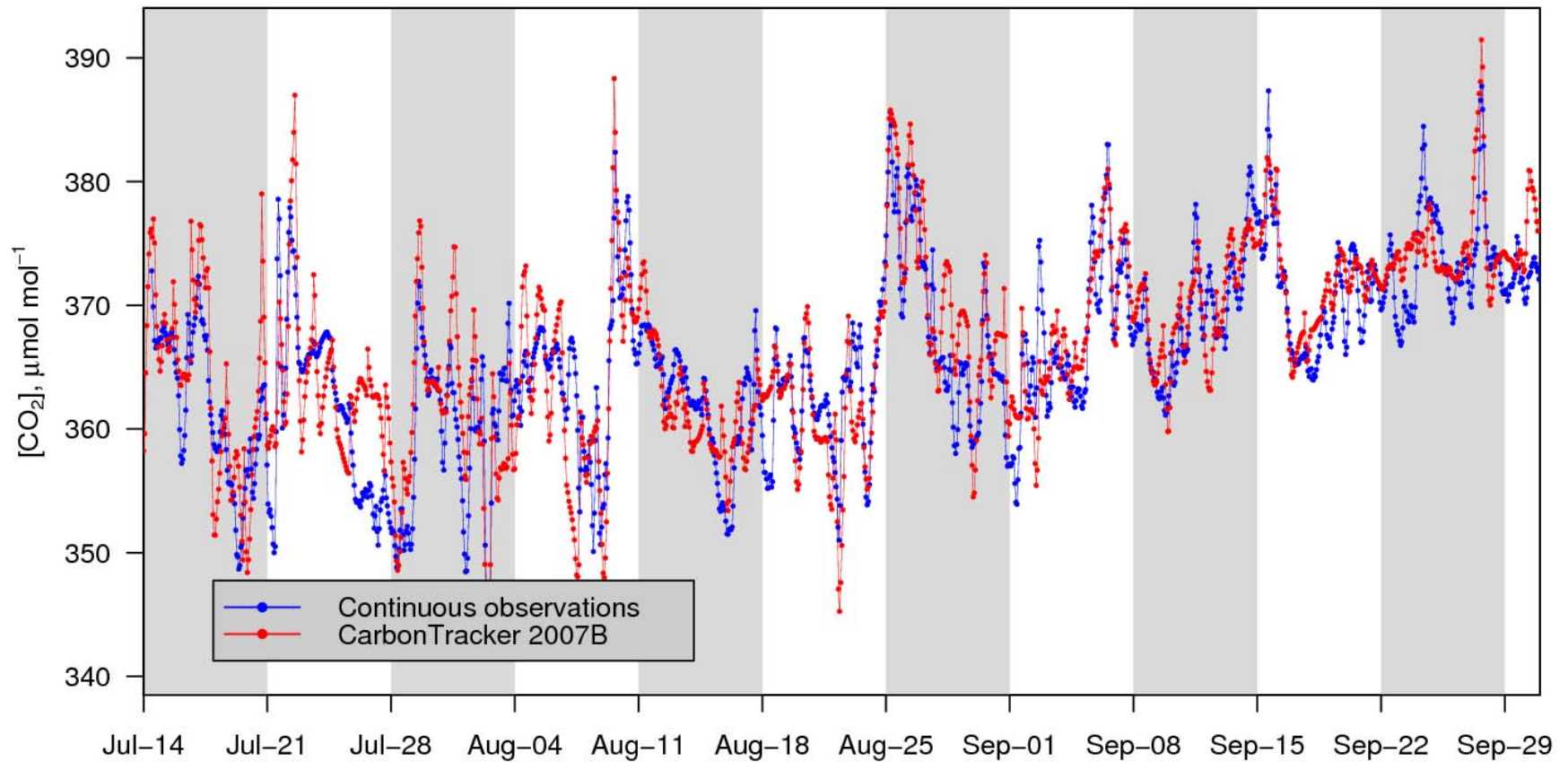
# How well does *CarbonTracker* work?

Park Falls, Wisconsin - WLEF tower at 396m: afternoon averages



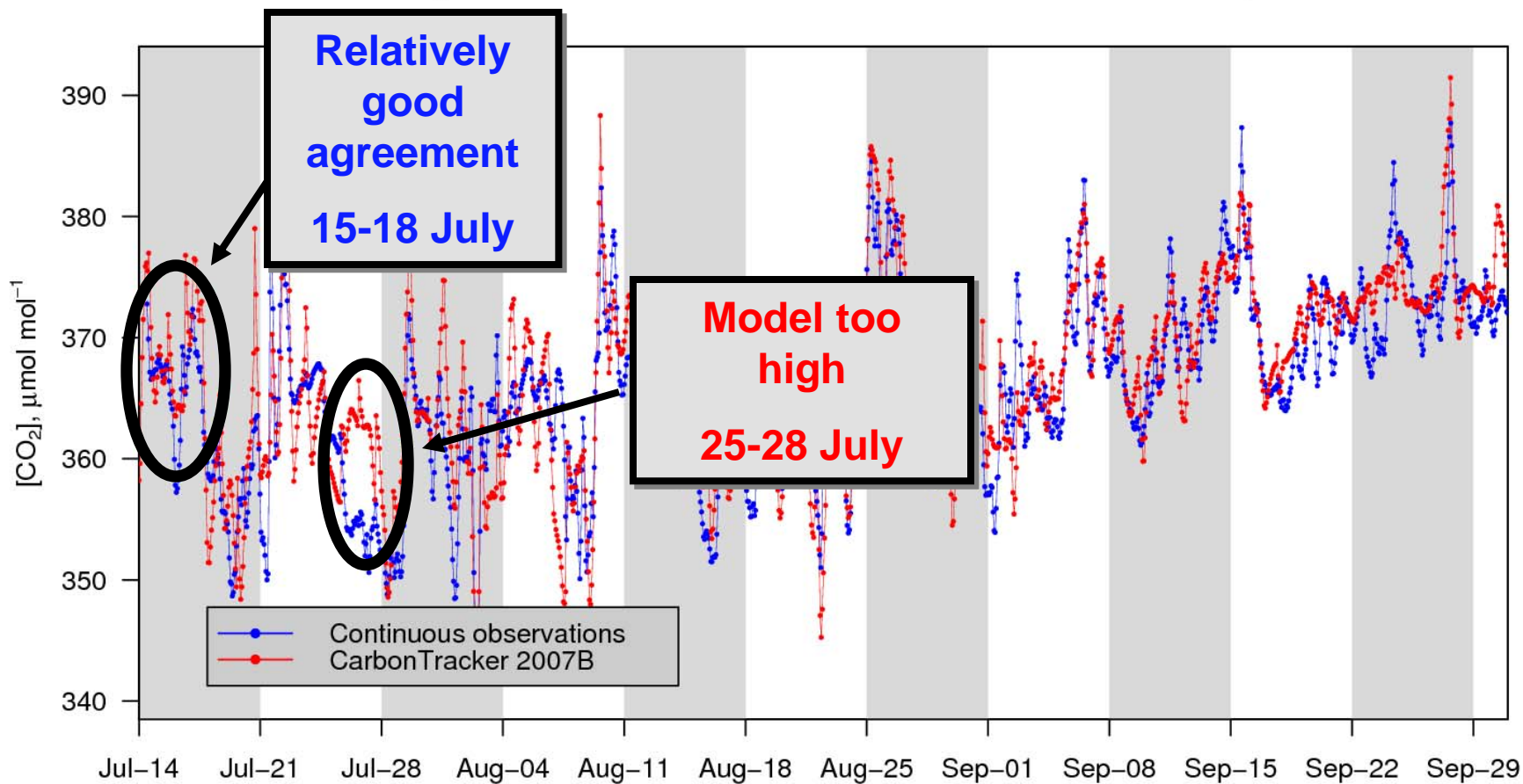
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Park Falls, Wisconsin: 396m continuous tower data for June–Sept. 2004



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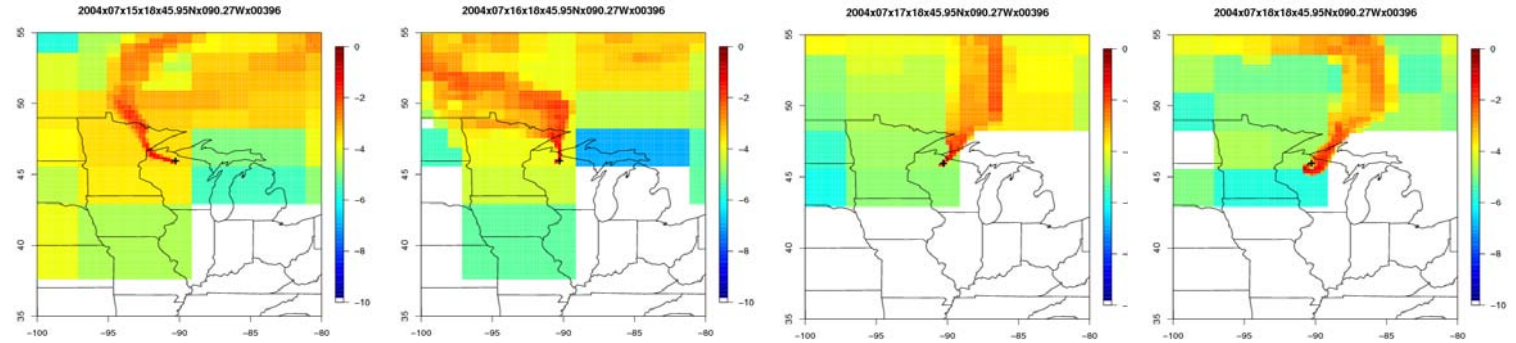
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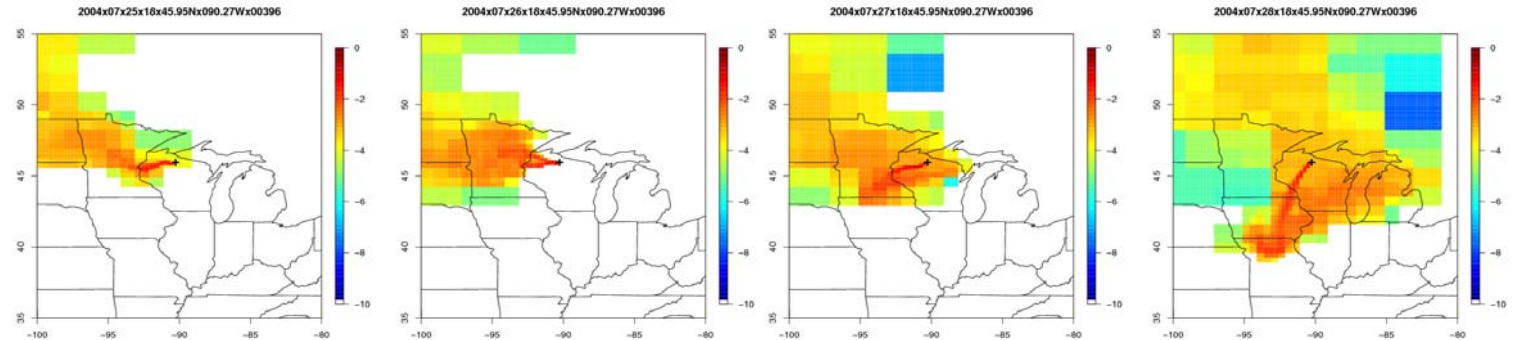
# How well does *CarbonTracker* work?

## STILT footprints for WLEF 396m afternoon averages

Relatively  
good  
agreement  
15-18 July



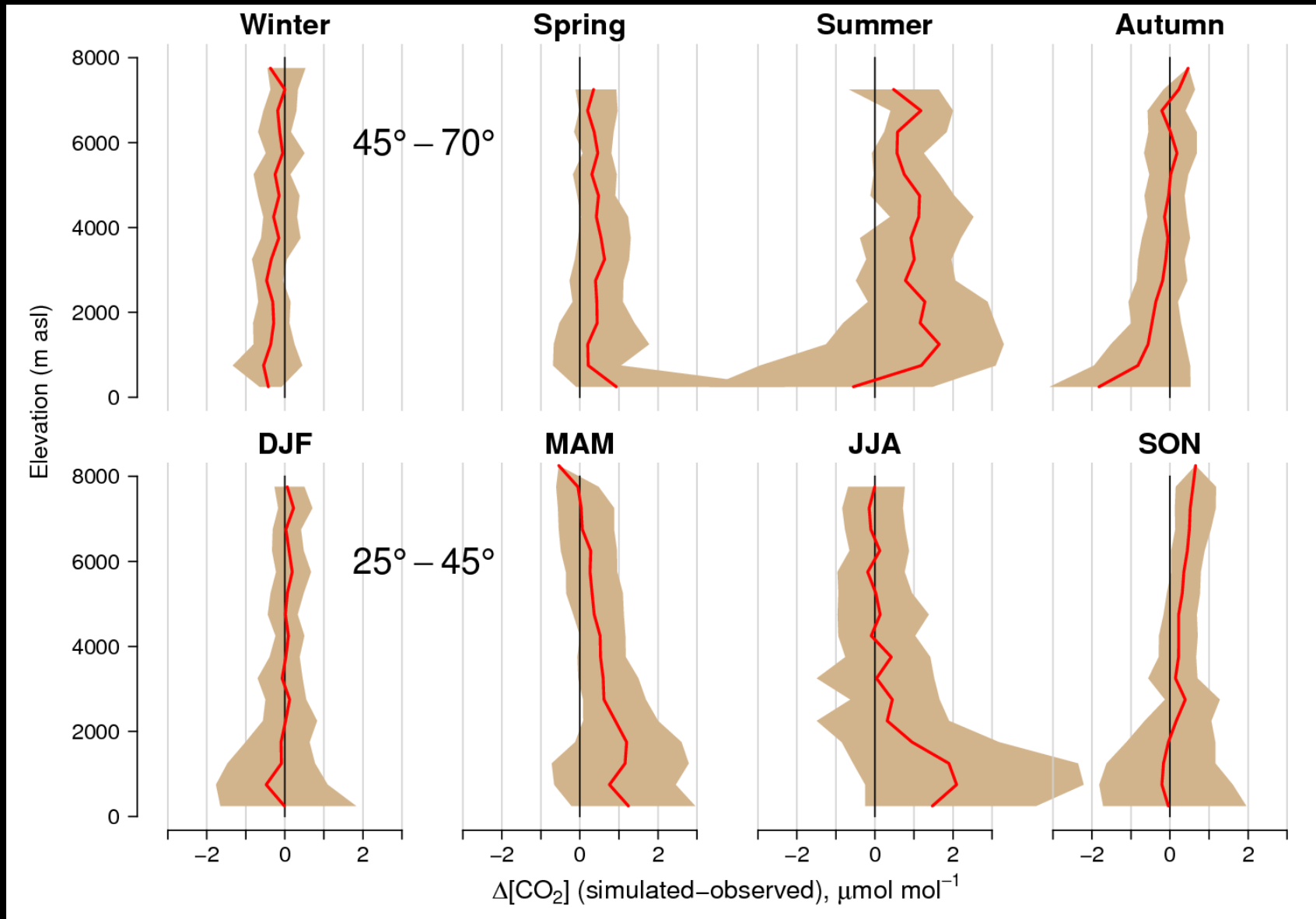
Model too  
high  
25-28 July





# How well does *CarbonTracker* work?

Aircraft residuals by latitude band and season





# Improving *CarbonTracker*

## Better meteorology

- higher resolution ECMWF
- adding NWS GFS to ensemble (underway)
- optimizing for vertical transport (underway)
- new NOAA models - WRF and FIMM

## Add more observations

- light aircraft (underway)
- expanded N. American network for 2007 (underway)
- TCCON & OCO
- GlobalView partners (underway)

## Other species

- methane (underway)
- carbon monoxide, isotopes?

## Better subsystems

- land (underway), ocean (underway)
- fossil fuels: better prior (underway); optimization?

## Couple with LPDM inversions

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# Why *CarbonTracker*?

## *For NOAA*

- as part of a functional observing system
- to understand changes
- to look for issues in data
- as a synthesis of the global carbon cycle

## *For science*

- to learn about transport deficiencies
- to improve the terrestrial, oceanic, and fossil fuel process models
- to quantify how well we can resolve fluxes (synthetic data experiments)
- to evaluate new observational sites and sampling methods via OSSEs

## *For the public*

- as an educational tool
- to provide policy-relevant information on CO<sub>2</sub>



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