### Introduction

MODELING AND SYNTHESIS THEMATIC DATA CENTER

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North American Carbon Prog

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Our understanding of how carbon is exchanged between terrestrial ecosystems and the atmosphere is gained from direct observations and experiments, as well as through modeling activities. Terrestrial biosphere models (TBMs) have become an integral tool for extrapolating local observations and understanding to larger regions. Although models vary in their specific goals and approaches, their central role within carbon cycle research is to provide a better understanding of the mechanisms currently controlling carbon exchange. Recently, the North American Carbon Program (NACP) organized several interim-synthesis activities to evaluate and inter-compare models and observations at local to continental scales for the time period of 2000 through 2005. Here, we present the results from the TBMs collected as part of the regional and continental interim-synthesis (RCIS) activities. (http://nacp.ornl.gov/ int\_synthesis.shtml)

### Objectives

The primary objective of this work is to synthesize and compare 19 TBMs to assess current understanding of the terrestrial carbon cycle in North America. Thus, the RCIS focuses on model simulations and data currently available from analyses that have been completed by ongoing NACP projects and other recently published studies. Bringing model estimates (and available data) together that incorporate a wide range of modeling approaches provides a valuable assessment of the current state of understanding of regional carbon flux across North America.

#### Models Participating in the NACP Regional Interim Synthesis

			External Factors Influencing NEP			Formulations	
Model	Native Temporal Resolution	NEP	Land- use/Land Cover Change	Fire	Transient Forcings	Photo- synthesis	Soil Carbon Decomp.
Prognostic Models							
Can-IBIS	30 min			prescribed	CO <sub>2</sub> , Ndep	EK	1 <sup>st</sup> order
CLM-CASA'	20 min GPP	GPP - (Ra+Rh)	prescribed land-use prescribed land- use, prognostic forest harvest		CO <sub>2</sub>	EK	1 <sup>st</sup> order
CLM-CN				prognostic	CO <sub>2</sub> , Ndep	EK	1 <sup>st</sup> order with N
DLEM	Daily	NPP - Rh		prescribed		EK	1 <sup>st</sup> order with N
ISAM	Weekly					LUE	1 <sup>st</sup> order with N
LPJ-wsl	Daily				CO <sub>2</sub>	EK	1 <sup>st</sup> order
MC1	Monthly			prognostic	CO <sub>2</sub> , Ndep	Statistical	1 <sup>st</sup> order with N
ORCHIDEE	30 min			prognostic	CO <sub>2</sub>	EK	1 <sup>st</sup> order with N
SiB3.1	Hourly	GPP - (Ra+Rh)			2	EK	Zero order
TEM6	Monthly		prescribed land- use, and forest harvest	prescribed	CO <sub>2</sub> , Ndep	EK	1 <sup>st</sup> order with N
VEGAS2	Daily			prognostic	CO <sub>2</sub>	LUE	1 <sup>st</sup> order
Diagnostic Models							
BEPS	Hourly	GPP - (Ra+Rh)	prescribed <sup>1</sup>	prescribed <sup>1</sup>	CO <sub>2</sub>	EK	1 <sup>st</sup> order with N
CASA- TransCom	Monthly	GPP - Re				LUE	1 <sup>st</sup> order
NASA-CASA		GPP - (Ra+Rh)	prescribed land-use		CO <sub>2</sub> , Ndep	LUE	1 <sup>st</sup> order with N
CASA GFEDv2		GPP - Re		prescribed		LUE	1 <sup>st</sup> order
EC-LUE	Weekly					LUE	
EC-MOD	Daily	-NEE				LUE	Zero order
MODIS	8-Day					LUE	
MOD17+	Daily	GPP - (Ra+Rh)				LUE	Zero order

<sup>1</sup>Biomass in BEPS is calculated from annual LAI which implies all disturbances that impact LAI will result in biomass changes.

### Methods

The TBM flux estimates are evaluated over different land cover regions of North America, and with respect to model type (i.e., prognostic versus diagnostic), temporal resolution, photosynthetic formulation, soil carbon dynamics, and whether they included impacts from land-cover / land-use change and transient forcings, such as changes in atmospheric carbon dioxide (CO<sub>2</sub>) and nitrogen (N) deposition.

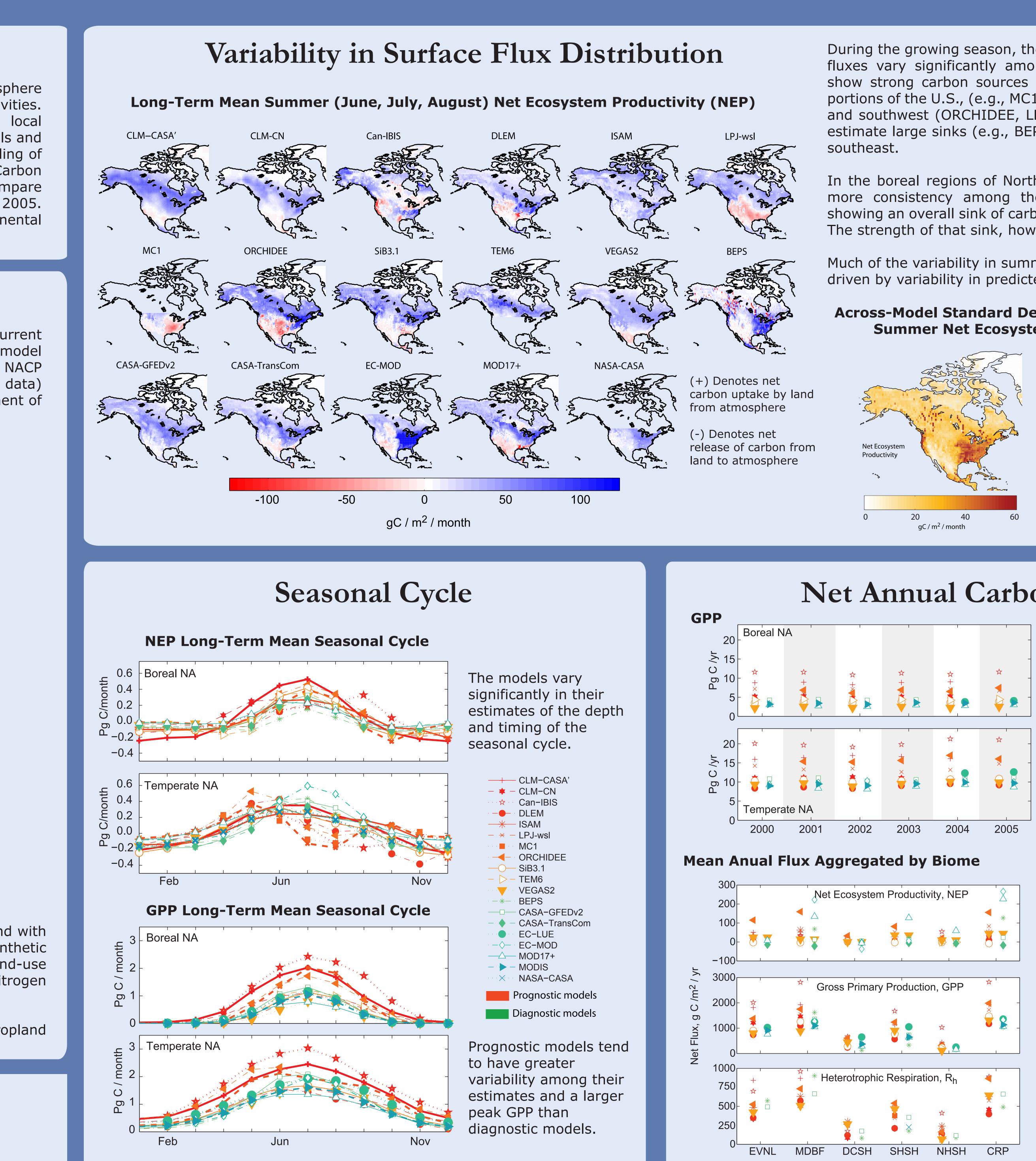
Model estimates were also compared to spatially explicit inventory-based estimates of cropland productivity.

Olson, D. M., et al. (2001), Terrestrial ecoregions of the worlds: A new map of life on Earth, Bioscience, 51(11), 933-938.

Taylor, K. E. (2001), Summarizing multiple aspects of model performance in a single diagram, Journal of Geophysical Research-Atmospheres, 106(D7), 7183-7192.

West, T. O., et al. (2010), Cropland carbon fluxes in the United States: Increasing geospatial resolution of inventory-based carbon accounting., Ecological Applications, 20(4), 1074-1086.

North American Carbon Program (NACP) Interim Synthesis Project: Regional Forward Model Intercomparison Wilfred M. Post<sup>1</sup>, Deborah N. Huntzinger (dnhuntzi@umich.edu)<sup>2</sup>, Anna M. Michalak<sup>2</sup>, Yaxing Wei<sup>1</sup>, Andrew R. Jacobson<sup>3</sup>, Robert B. Cook<sup>1</sup>, and NACP Regional Interm Synthesis Participants<sup>4</sup> <sup>1</sup>Oak Ridge National Laboratory, Oak Ridge, TN; <sup>2</sup> University of Michigan, Ann Arbor, MI; <sup>3</sup>Earth System Research Laboratory, NOAA, Boulder, CO; <sup>4</sup>Regional-Level Interim Synthesis, North American Carbon Program, Oak Ridge, TN.

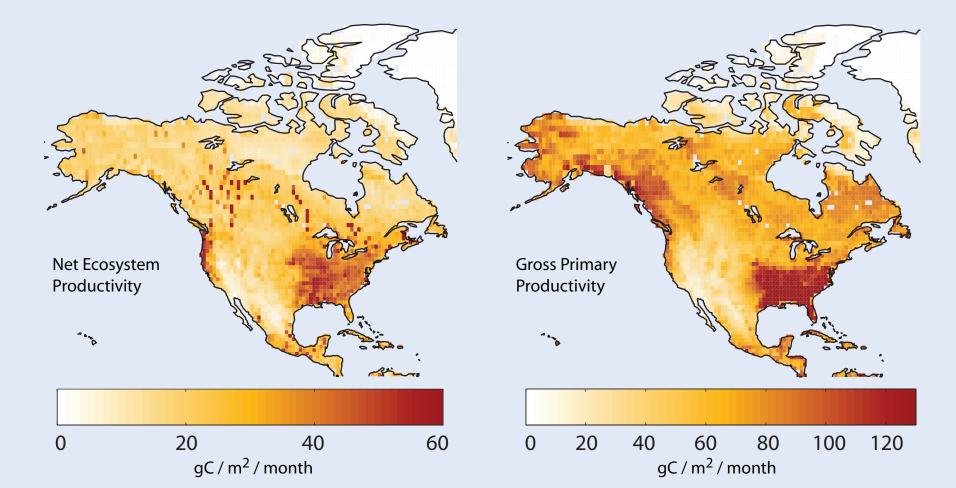


During the growing season, the magnitude and distribution of fluxes vary significantly among the models. Some models show strong carbon sources in the midwest and southeast portions of the U.S., (e.g., MC1, LPJ-wsl), central plains, west, and southwest (ORCHIDEE, LPJ-wsl, MOD17+), while others estimate large sinks (e.g., BEPS, EC-MOD) particularly in the

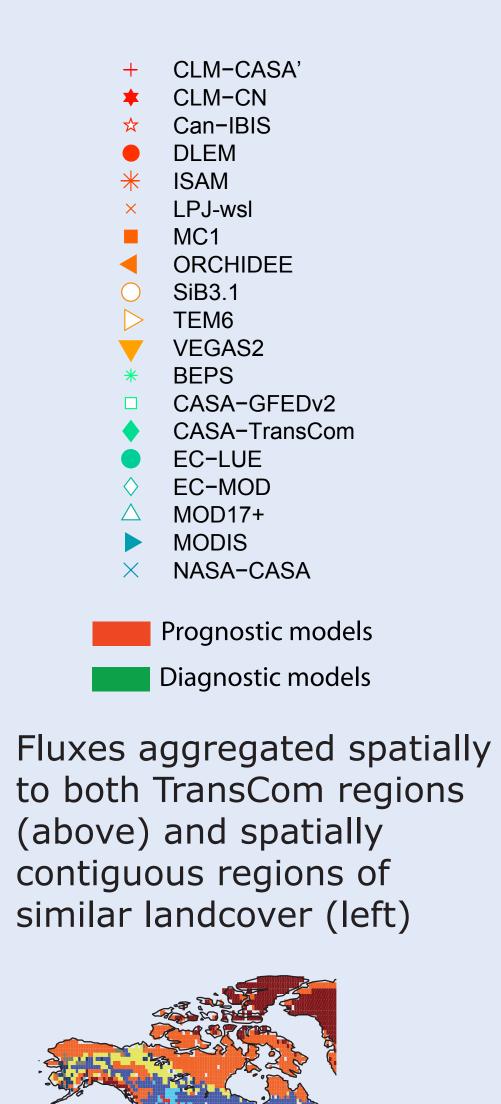
In the boreal regions of North America there appears to be more consistency among the models, with most models showing an overall sink of carbon during the summer months. The strength of that sink, however, varies across models.

Much of the variability in summertime NEP in the southeast is driven by variability in predicted GPP.

#### Across-Model Standard Deviation in Long-Term Mean **Summer Net Ecosystem Productivity (NEP)**



## Net Annual Carbon Flux



modified from

Olson et al. 20

Evergreen & needleleaf (EVN

Mosaic & burnt (MSC)

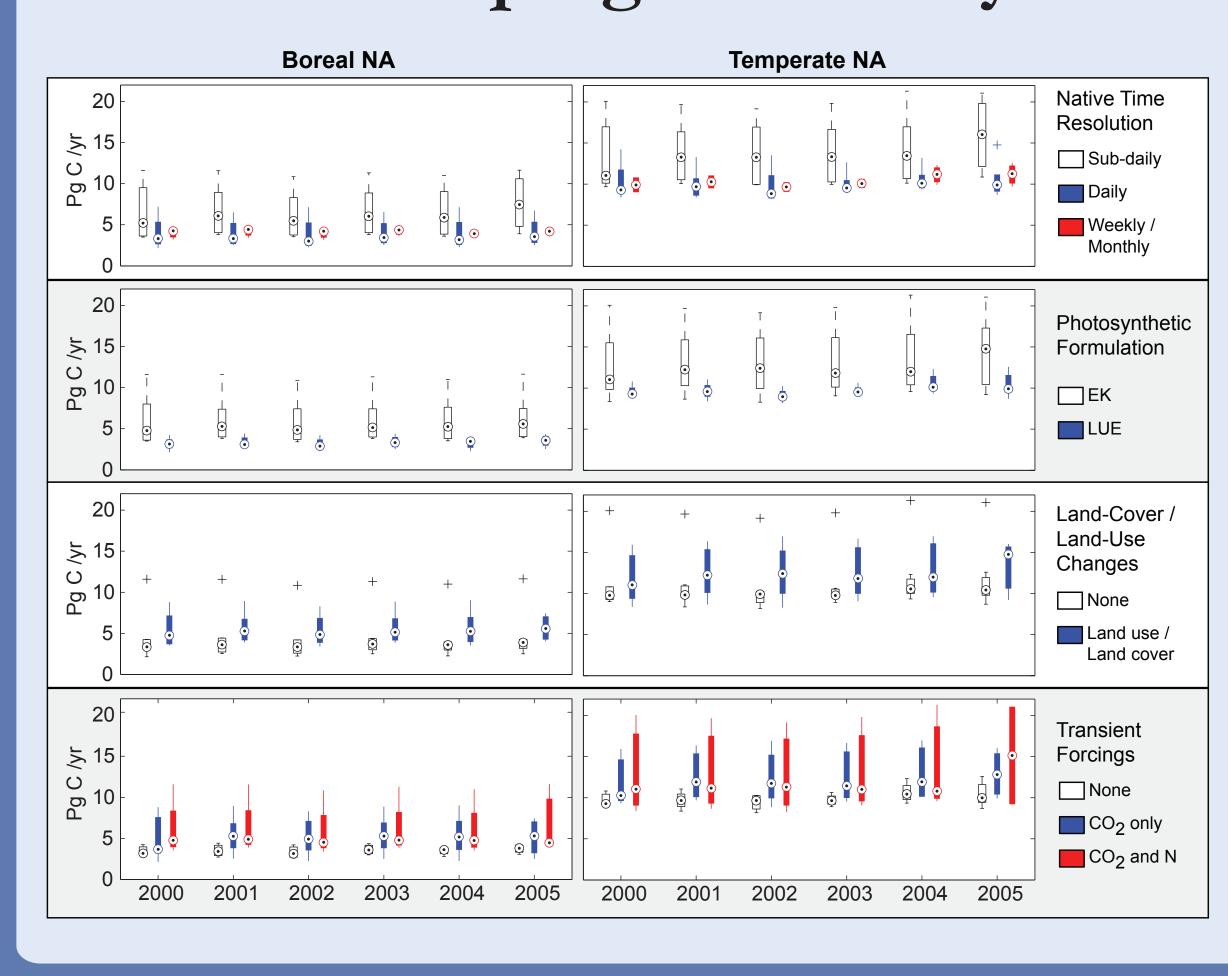
Snow & ice (SNI)

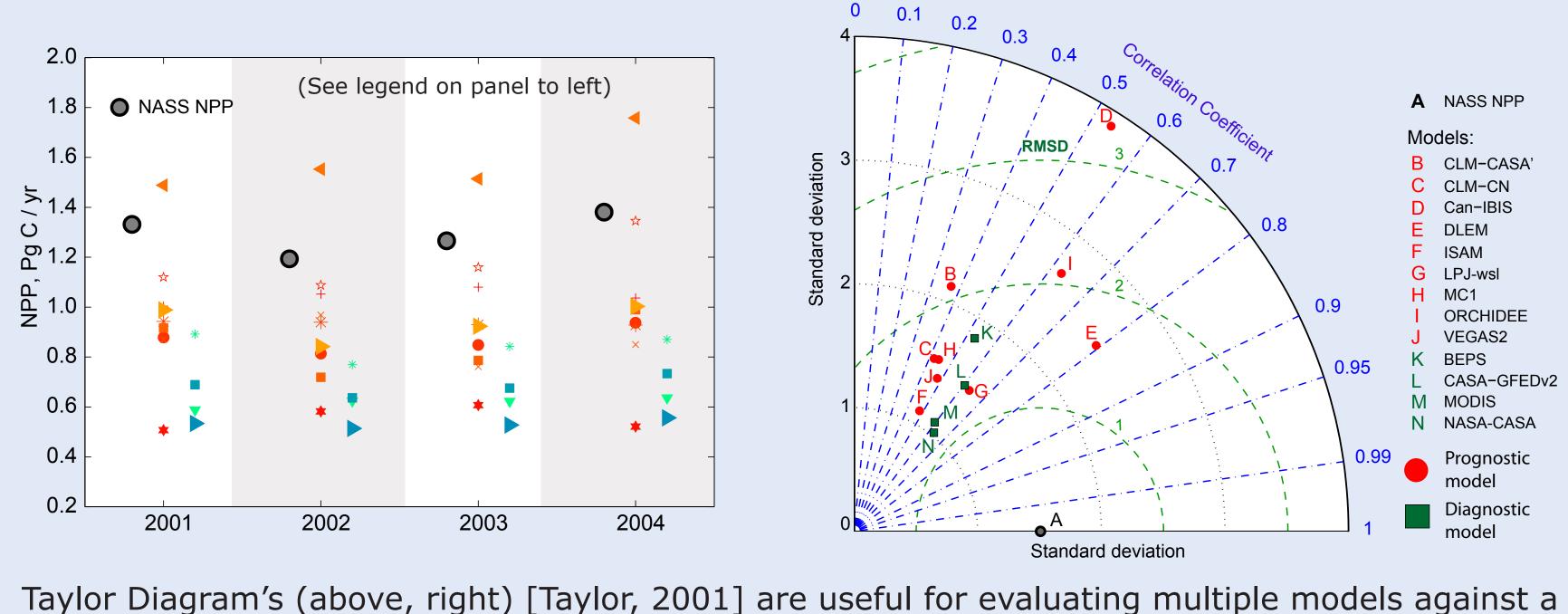
Evergreen shrublands (EVSH)

eciduous shrublands (DCSH) Northern herbaceous shrublands (NHSF Southern herbaceous shrublands (SHSH)

Cultivated & managed lands (CRP)

Mixed & deciduous broadleaf forests (MDBF)





Taylor Diagram's (above, right) [Taylor, 2001] are useful for evaluating multiple models against a chosen dataset or reference. Models that closely match the spatial pattern of the NASS inventory data will have a small centered root mean squared difference (RMSD), a correlation coefficient close to 1, and a standard deviation similar to that of the NASS inventory.

There is significant disagreement among the models in their estimates of flux, both in terms of the net carbon uptake and the timing and depth of their estimated seasonal cycles. The range in estimates from the models appears to be driven by a combination of factors, including how the model represents photosynthesis, the source of environmental driver data, temporal resolution, as well as whether land-cover use and/change and/or transient forcings such as increased atmospheric carbon dioxide and nitrogen deposition are included in the model. The results of this study highlight the disagreement in current estimates of carbon flux across North America. The results also highlight the need for further analysis through the use of formal model intercomparisons that include a detailed model simulation protocol in order to isolate the influence of model formulation, structure, and assumptions on flux estimations (e.g., http://nacp.ornl.gov/MsTMIP.shtml).

#### Acknowledgments

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# **Grouping Models by Other Factors**

Grouping models by different formulation types/classes is a useful means of comparison. It highlights difference in flux that would be difficult to see otherwise. However, many other factors may influence flux estimates among the models (e.g., environmental driving variables, initial conditions, spin-up, land-cover type). Formal model simulations conducted with a detailed protocol and standardized drivers are needed to properly evaluate the influence of model formulation, structure, and assumptions on flux estimations.

# **Comparing Models to Inventory-Based Estimates**

Model estimates of annual NPP are compared to inventory-based cropland NPP estimates derived from NASS yield data [West et al., 2010] for predominant agricultural areas within the United States. Most models do not actually model agricultural ecosystems, and those that do, often do so simply (e.g., as a fertilized C3 or C4 grassland). In general, the models predict lower NPP than the inventory data. Prognostic models tend to predict great NPP than diagnostic models.

### Conclusions