

# Synthesis and Integration of Recent Research Characterizing the Carbon Cycle of Northern Eurasia

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# **Synthesis and Integration of Recent Research Characterizing the Carbon Cycle of Northern Eurasia**

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# **A Warming Climate Is Being Manifested Across The Arctic In:**

- A More Intense Hydrologic Cycle**
- Thawing Permafrost**
- Shrub Expansion**
- Alteration in Surface Water Amounts**

# Domain of Interest: Northern Eurasia



## FORESTS

- Evergreen Needleleaf Forest
- Deciduous Broadleaf Forest
- Needleleaf / Broadleaf Forest
- Mixed Forest
- Broadleaf / Needleleaf Forest
- Deciduous Needleleaf Forest

## SHRUBLANDS

- Needleleaf Evergreen Shrubs
- Broadleaf Deciduous Shrubs

## GRASSLANDS

- Humid Grasslands
- Steppe

## WETLANDS

- Bogs and Marsh
- Palsa Bogs
- Riparian Vegetation

## TUNDRA

- Barren Tundra
- Prostrate Shrub Tundra

- Sedge Tundra
- Shrub Tundra

## OTHER VEGETATION TYPES AND COMPLEXES

- Recent Burns
- Croplands
- Forest - Natural Vegetation Complex
- Forest - Cropland Complex
- Cropland - Grassland Complex

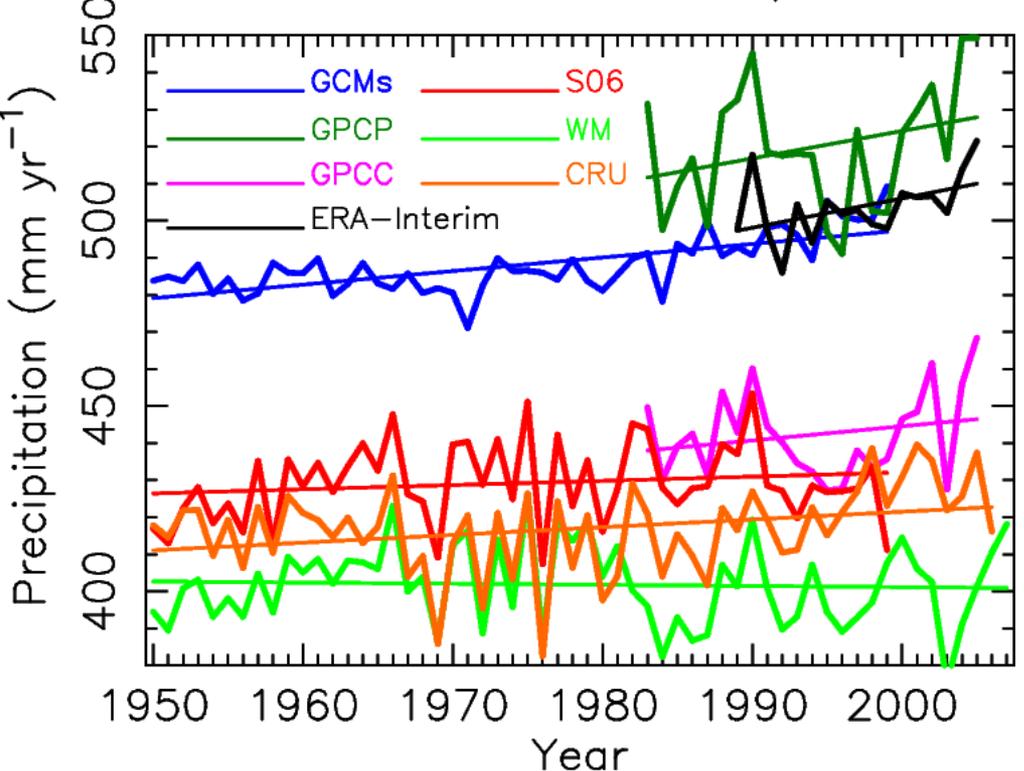
## NON-VEGETATED LAND COVER TYPES

- Bare Soil and Rock
- Permanent snow / ice
- Inland water bodies
- Urban
- Salt-pans

Country borders

# Synthesis of data sets point to intensification of arctic freshwater water cycle as predicted by models

Annual Pan-Arctic Precipitation



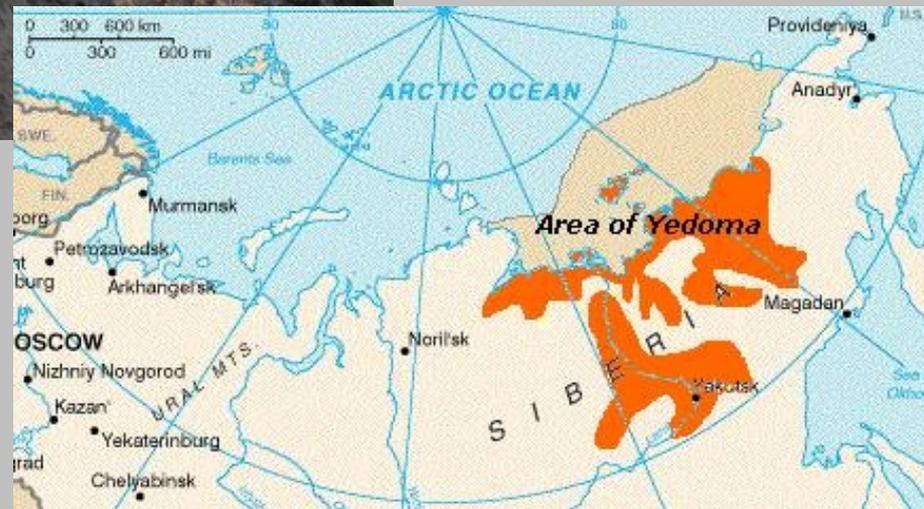
Data Set	Trend (mm yr <sup>-2</sup> )
GCMs	0.29
GPCP	0.74
GPCC	0.38
WM	-0.03
ERA-Interim	0.79
CRU	0.21
Sheffield et al.	0.11

Rawlins et al., J. Climate, 2010

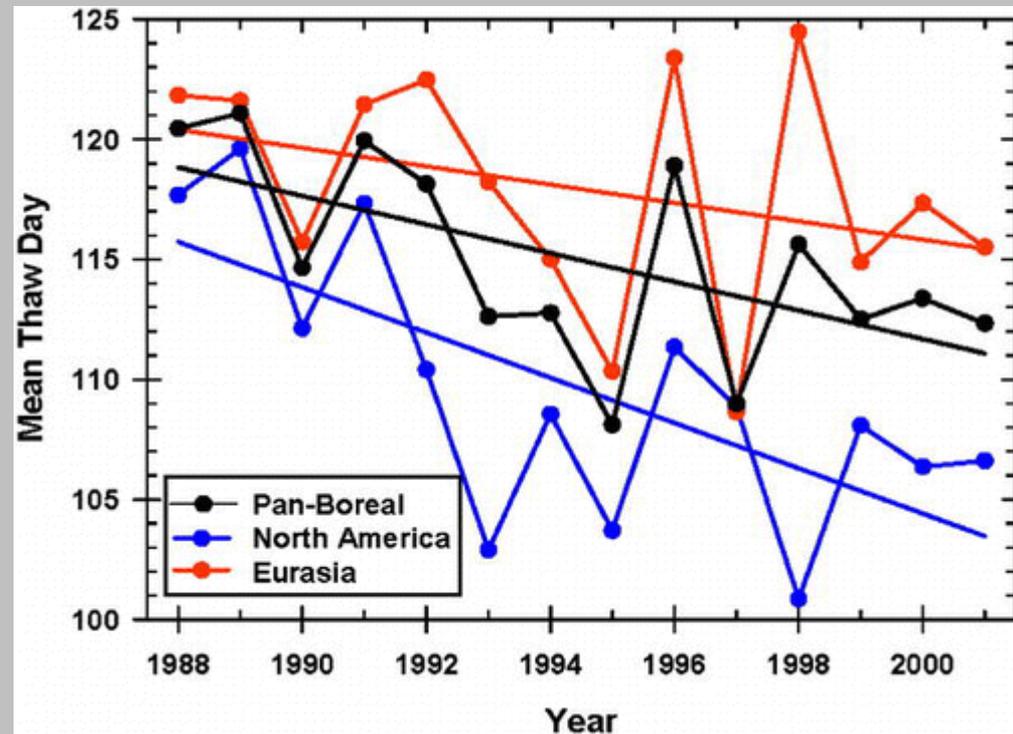
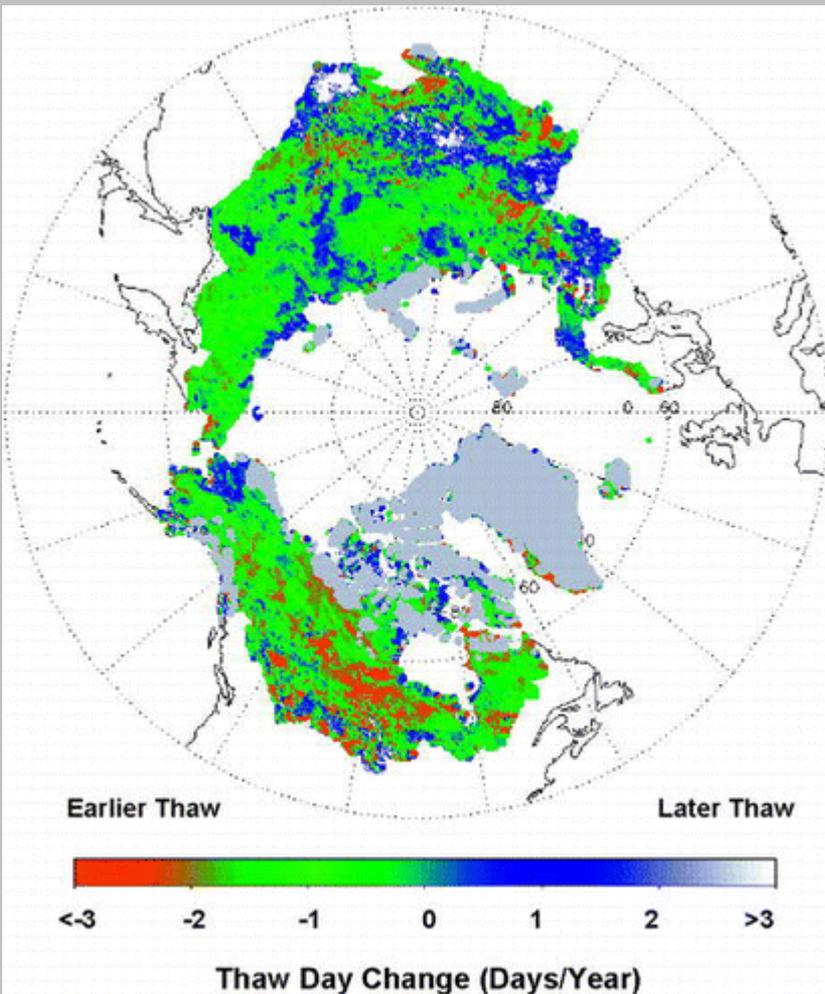
# Yedoma



- carbon-rich permafrost
- formed during the last Ice Age
- high ice content
- contains 1-5% carbon



# The Arctic is exhibiting a trend toward earlier seasonal thawing and growing season onset



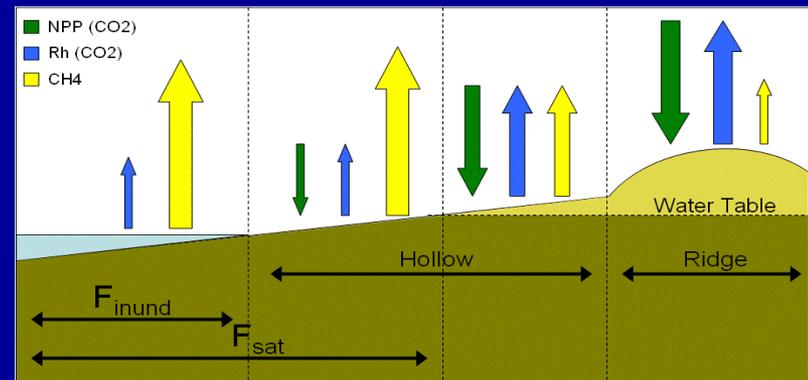
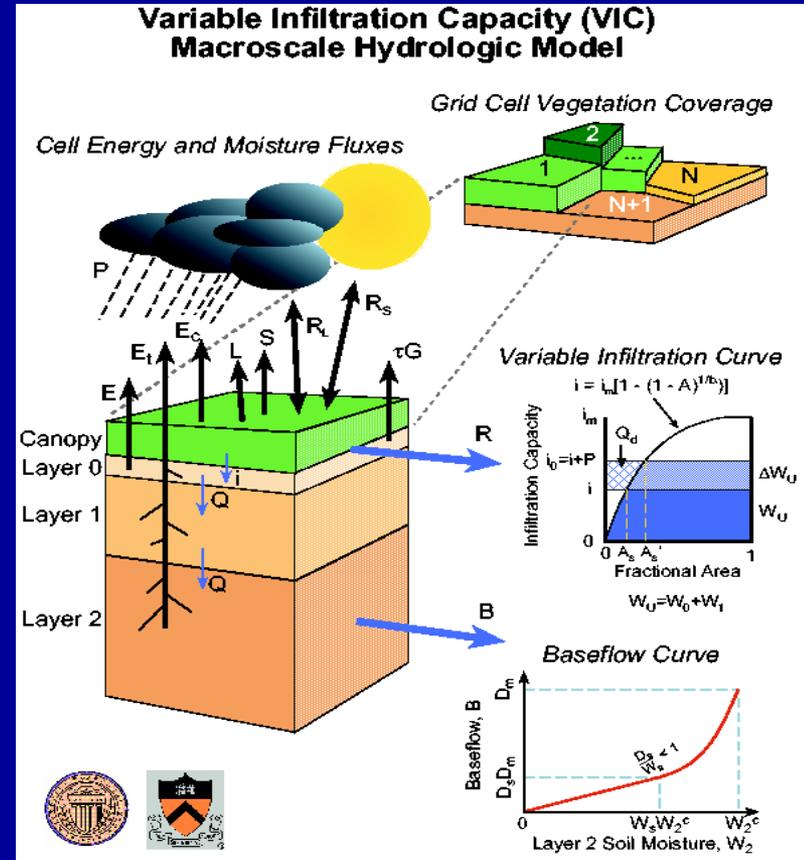
Thaw day estimates derived from SSM/I passive microwave radiometer data

# Science Questions and Objectives of Study

- **What is the magnitude of CO<sub>2</sub> and CH<sub>4</sub> fluxes from the land surface, including soils, wetlands and lakes, over seasonal and annual timescales. Which areas are sources and which are sinks?**
- **How will terrestrial ecosystems in Northern Eurasia respond to continued warming, and what are the dominant processes likely to affect future spatial and temporal carbon cycle dynamics?**
- **Can models which assimilate remote sensing and flux tower data accurately predict carbon spatio-temporal dynamics, from local scales to large region estimates?**

# Modeling Framework

- VIC hydrology model
  - Large, “flat” grid cells (e.g. 100x100 km)
  - Mosaic of land cover tiles
  - On hourly time step, simulate:
    - Soil T profile (and permafrost)
    - Water table depth  $Z_{WT}$
    - NPP, Rh, Soil Carbon
  - Dynamic Lake-wetland model (Bowling and Lettenmaier 2010)
  - Wetland microtopography
- Link to CH4 emissions model (Walter & Heimann 2000)



# Climate Factors

***Relationships non-linear***

***Water table depth not uniform across landscape - heterogeneous***

Living Biomass

Acrotelm

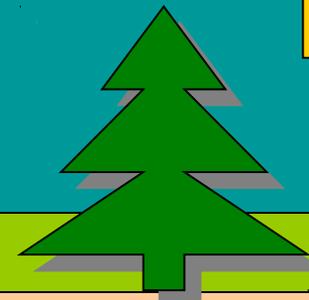
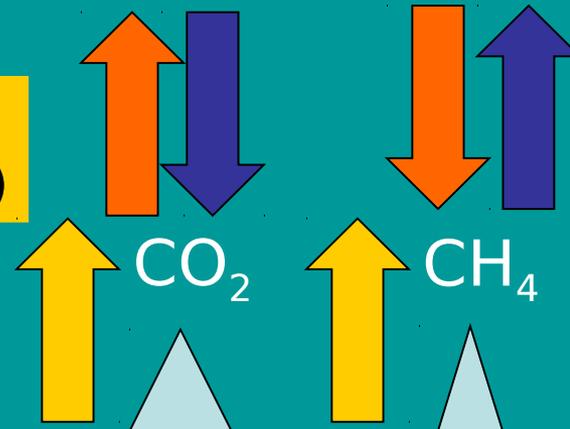
Water Table

Catotelm

Temperature  
(via metabolic rates)

Temperature  
(via evaporation)

Precipitation



Aerobic  $R_h$

Anaerobic  $R_h$

Note: currently not considering export of DOC from soils

## Validation and Parametrization of Models

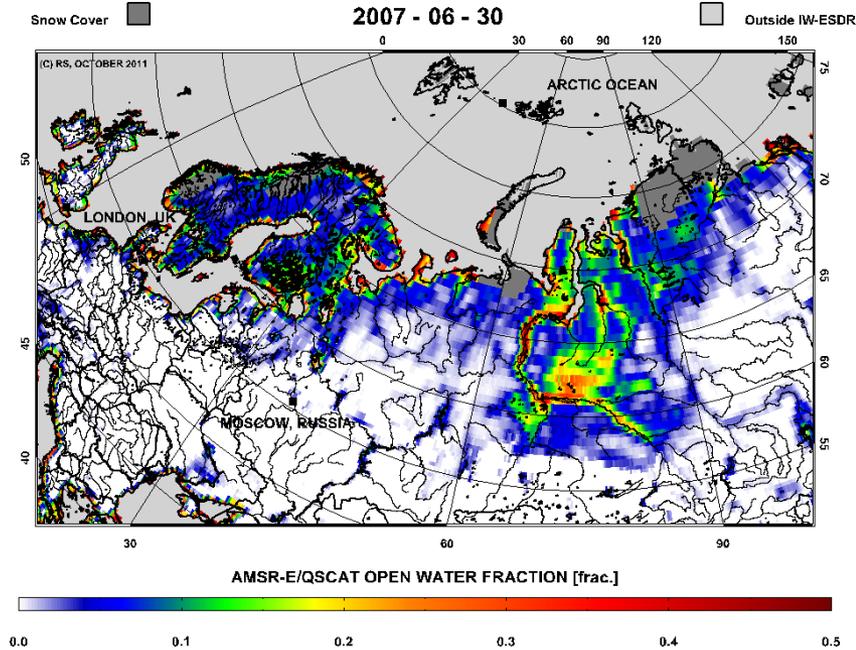
**Remote sensing products of fractional inundation extent (25x25 km) are used to capture seasonal and interannual variation of surface water across the NEESPI region**

**This moderate resolution product is being evaluated against high-resolution PALSAR data for dates on which both are available**

# Satellite Microwave Remote Sensing of Inundated Wetlands

## Eurasia, Wetland Extent Map

- Record Discharge of 2007\*\* -



Sensors: **AMSR-E/QuikSCAT (IW-ESDR)**

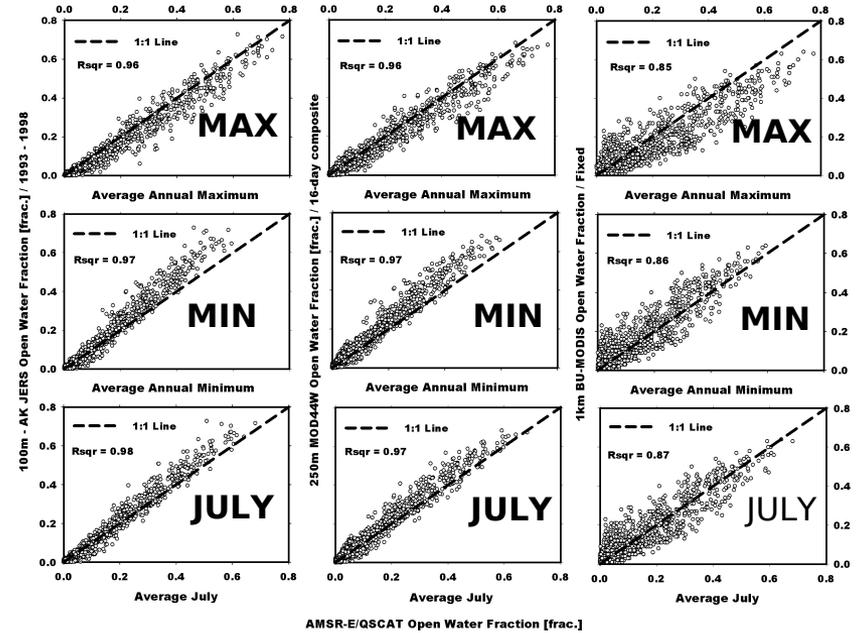
Spatial/Temporal Resolution: **Global @ 25 km Equal-Area-Grid**  
**Daily/10-Day Averages, 2002-2009,**  
**Limited to Non-Frozen Period**

Data Download: [wetlands.jpl.nasa.gov](http://wetlands.jpl.nasa.gov)

\* Schroeder et al. 2010    \*\* Rawlins et al. 2009

## Alaska, Accuracy Assessment

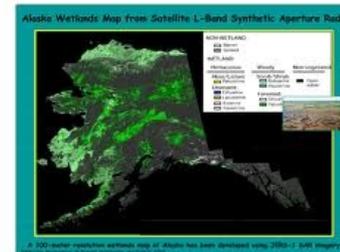
- JERS Wetland Map, MOD44W, BU-MODIS -



**JERS**

**MOD44W**

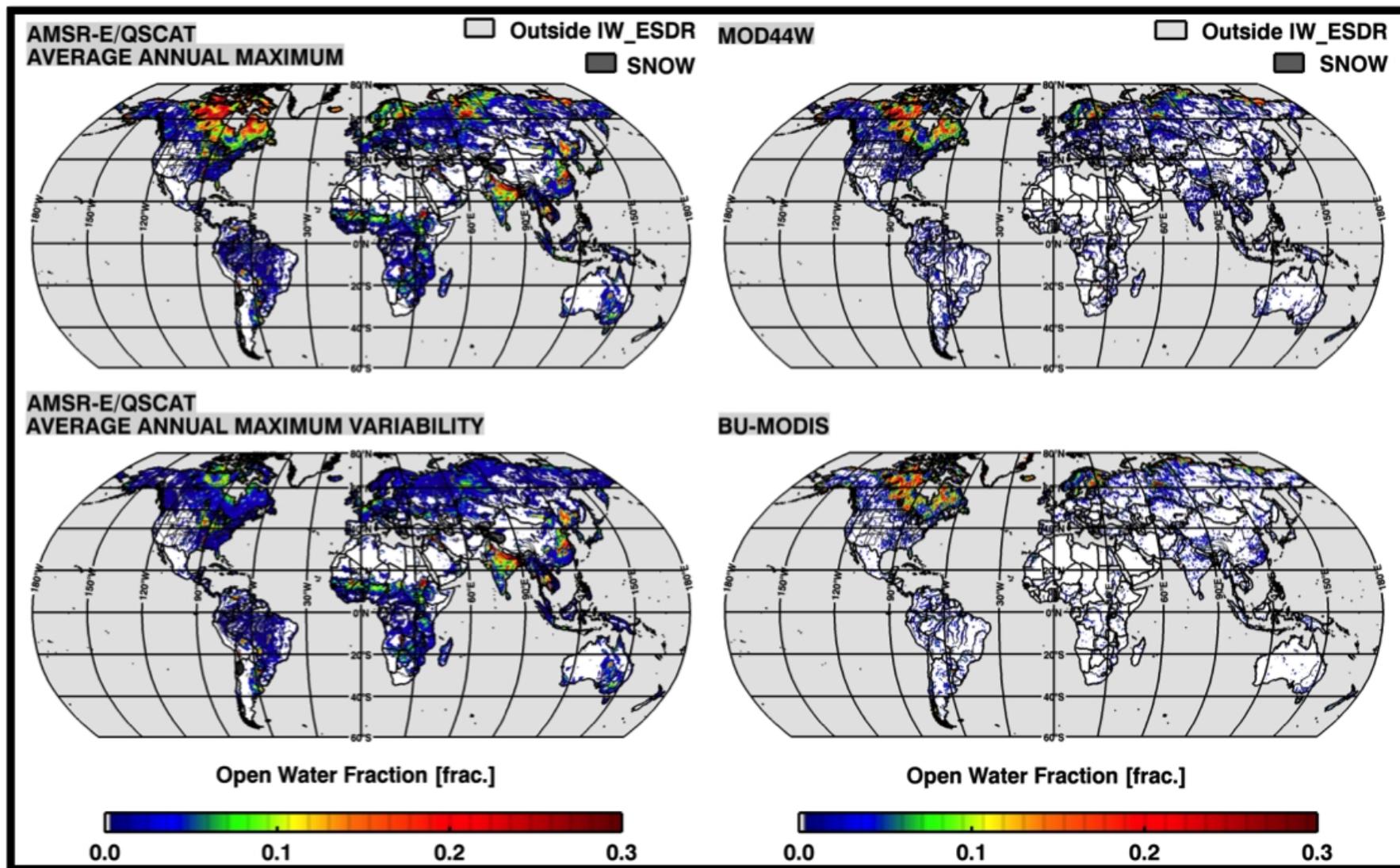
**BU-MODIS**



**JERS wetland extent map\*\***

\*\* Whitcomb et al. 2009

# Inundated Area 25x25km Global Product Derived From A Combination of AMSR-E and QSCAT Data



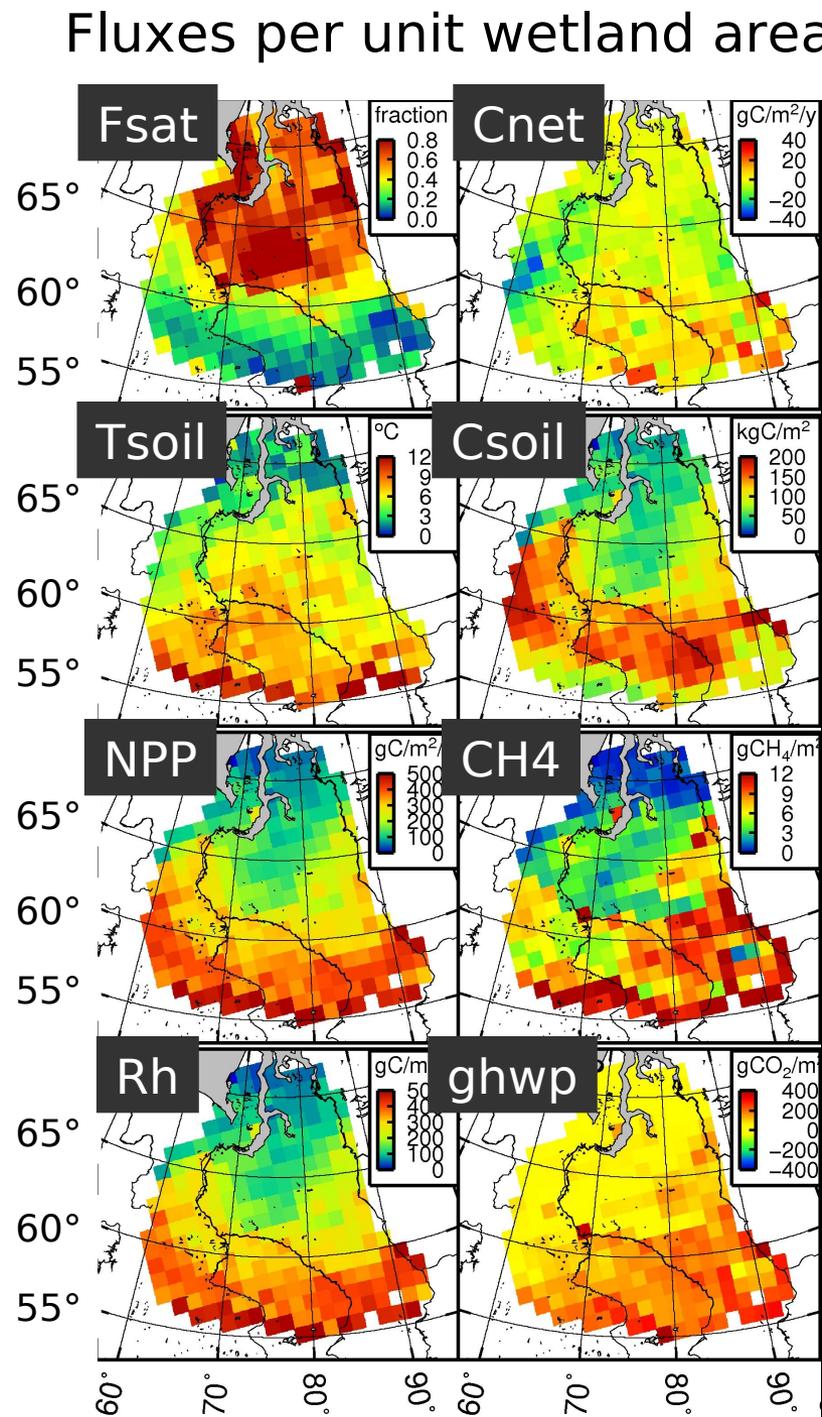
Project Co-I Kyle McDonald (CCNY/JPL); PhD Ronny Schroeder (CCNY)

# State/Fluxes, 2001-2010

Strong anti-correlation between soil moisture and carbon fluxes

- Fsat (saturated fraction) highest **north of 60 N**
- Carbon fluxes are highest **south of 60N**

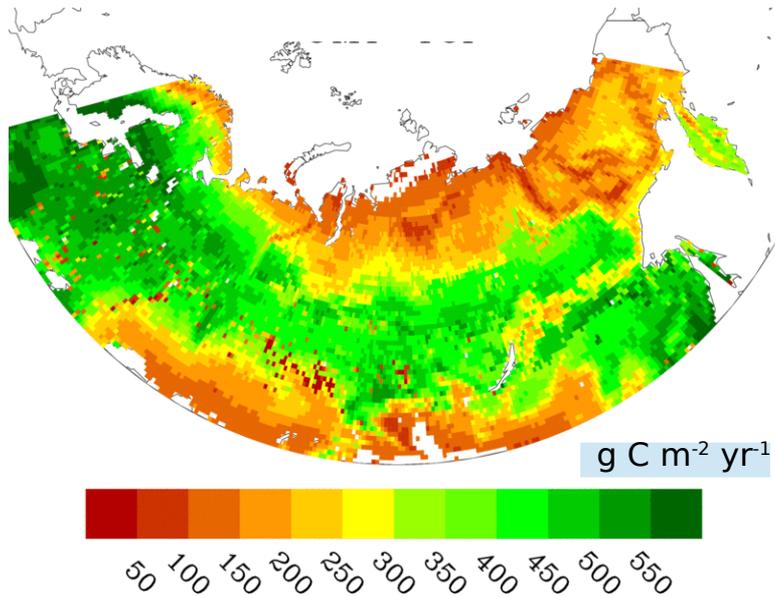
All carbon fluxes very low in continuous permafrost



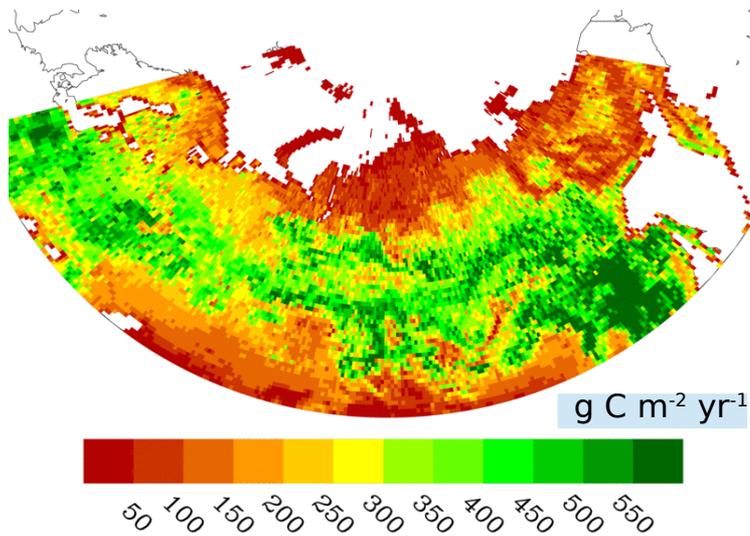
# Net Primary Productivity across NEESPI region from three models

Data courtesy of collaborators A. Dave McGuire (U. Alaska – Fairbanks); Dan Hayes, (ORNL) John Kimball (U. Montana), Hank Shugart (U. Virginia)

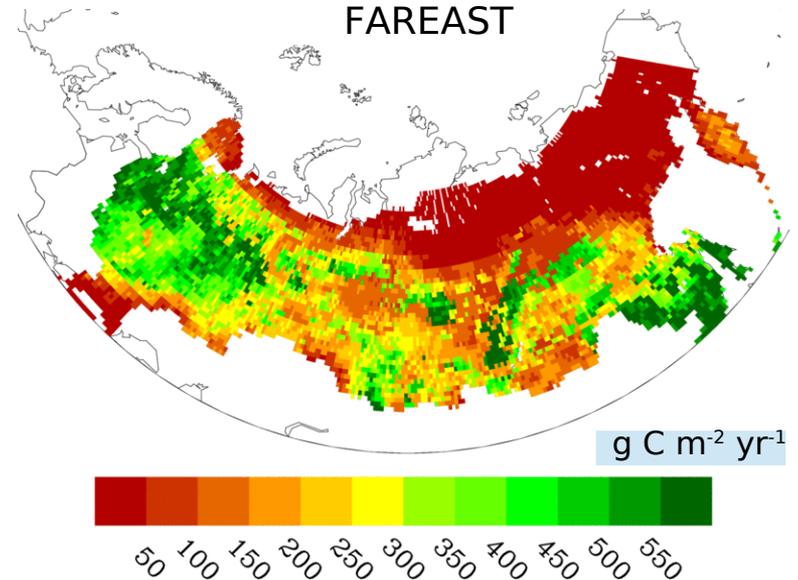
### Terrestrial Carbon Flux Model



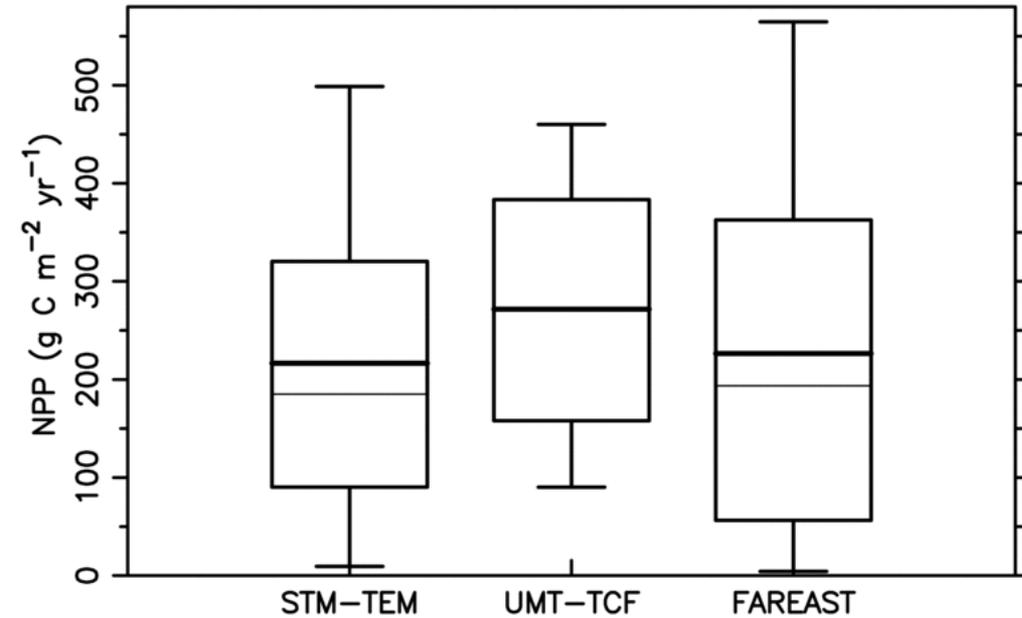
### TEM6



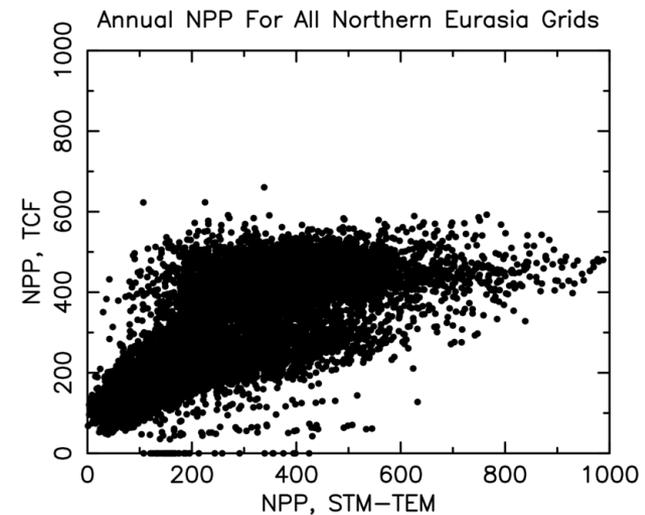
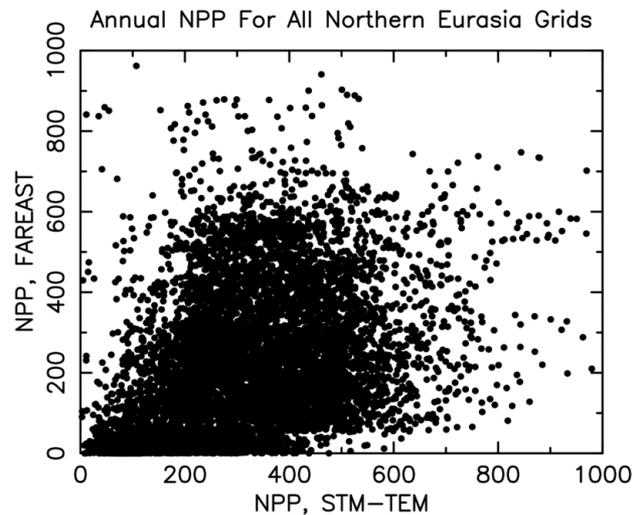
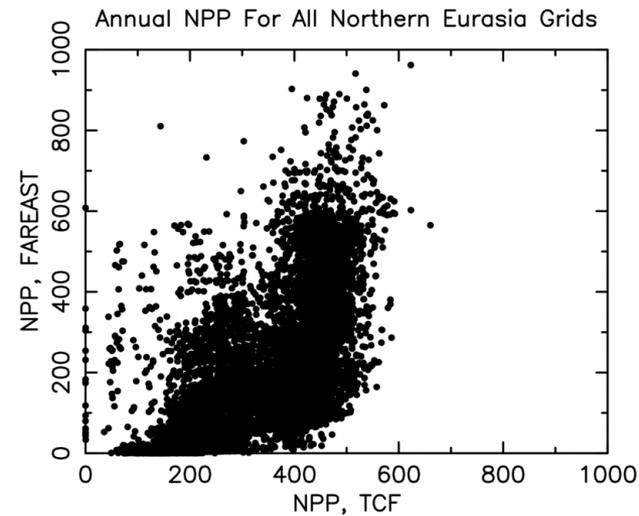
### FAREAST



## Annual Net Primary Productivity Across NEESPI Region, 2000–2006



- FAREAST exhibits largest range
- TCF maximum of  $450 \text{ g C m}^{-2} \text{ yr}^{-1}$
- Grid-to-grid correlations are limited as expected
- Are interannual variations correlate among models?

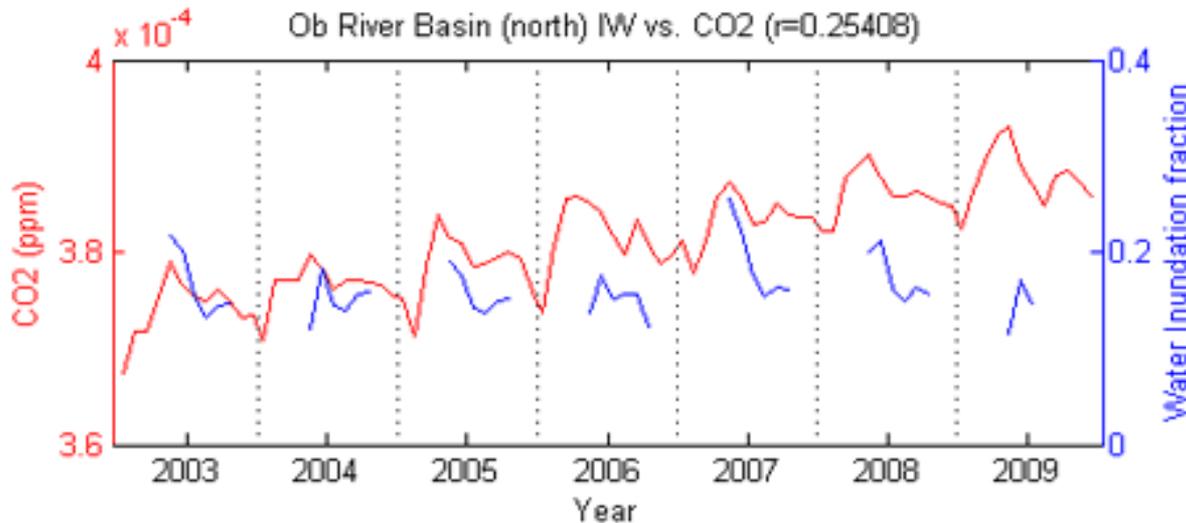


## Other TEM6 flux data:

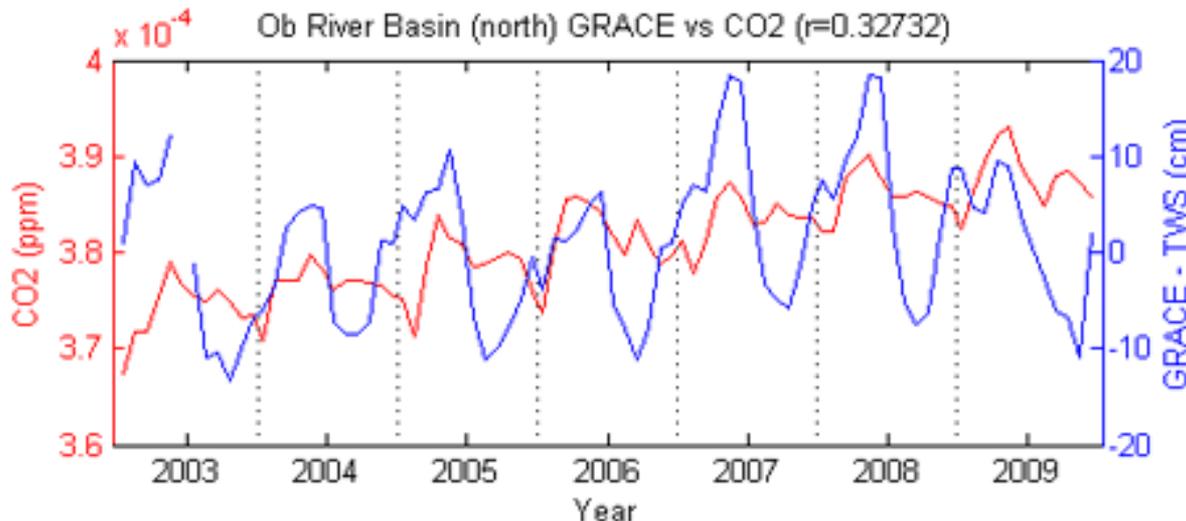
- total carbon emitted in fire
- total carbon emitted in fire as CO<sub>2</sub> (as opposed to CH<sub>4</sub>, CO, etc)
- total carbon emitted from the decay of harvested forest and agricultural products
- total flux of dissolved organic carbon (DOC)
- total carbon balance
- net ecosystem exchange (NEE)

*data described in McGuire et al., 2010, Tellus*

# Correlative analysis between atmospheric carbon and inundated wetland/water storage variations, 2002- 2009 Ob River Basin

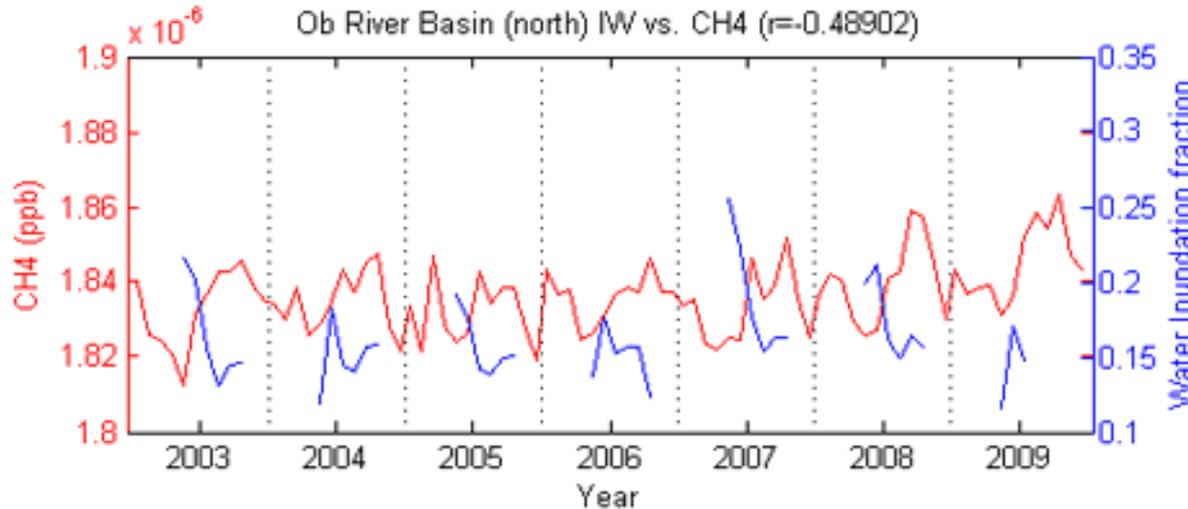


AIRS CO<sub>2</sub> is **positively correlated** with surface inundated area



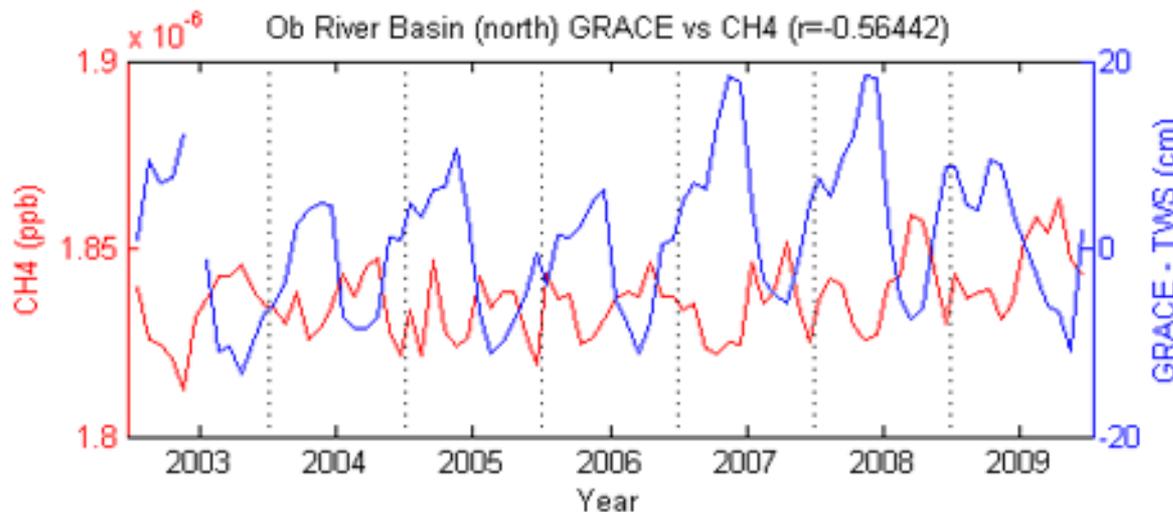
AIRS CO<sub>2</sub> also shows a positive correlation with Total Water Storage

# Correlative analysis between atmospheric carbon and inundated wetland/water storage variations, 2002- 2009 Ob River Basin



Land surface methane flux from AIRS is **positively correlated** with surface inundated area

Inundated area time series is limited to thawed period



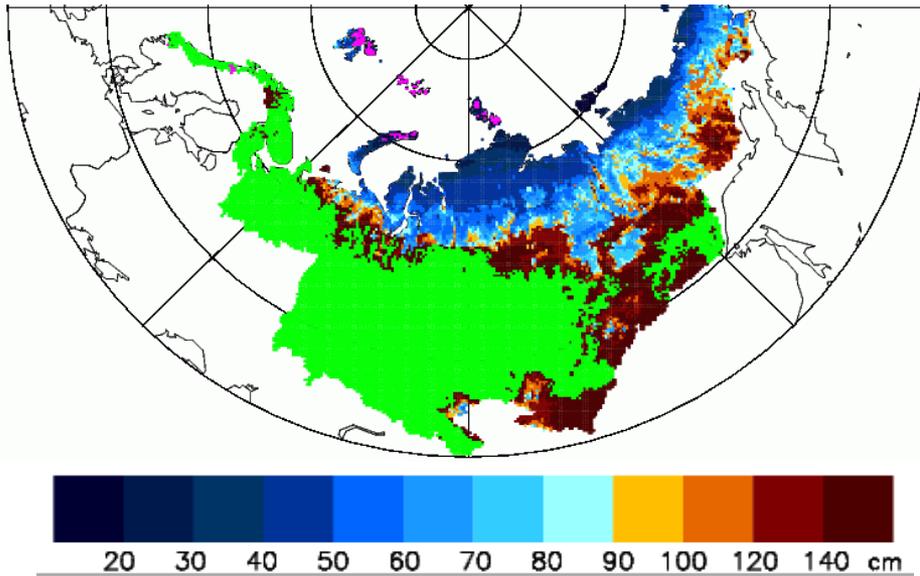
Methane flux and terrestrial water storage from GRACE are **inversely correlated**

Project Co-I Kyle McDonald (CCNY/JPL); PhD students Ronny Schroeder and Kat Jensen (CCNY)

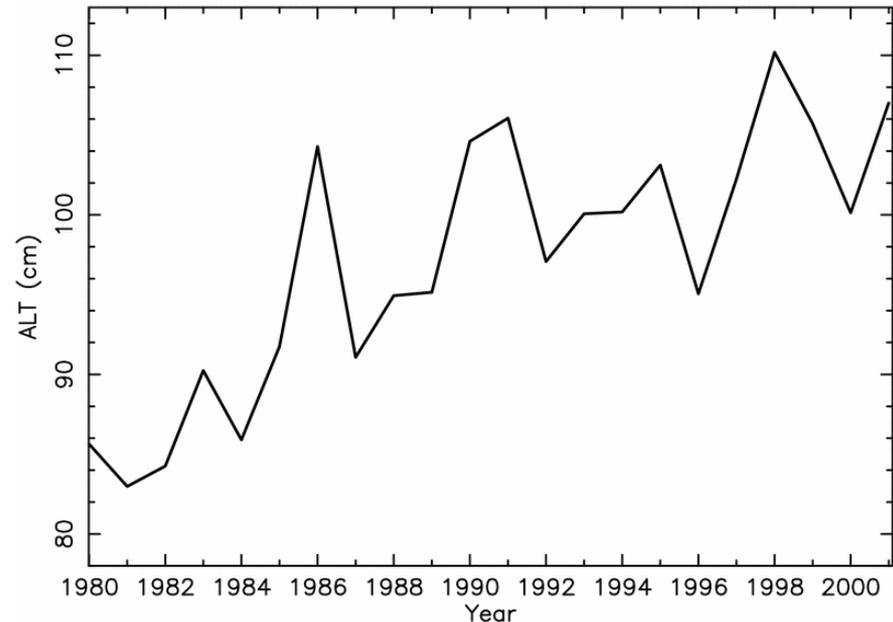
# Estimates of maximum seasonal active layer thickness (ALT) from Pan-Arctic Water Balance Model (PWBM)

Mean Over 1980-1999

*Rawlins et al., JAMES, submitted*



Average ALT for region of continuous permafrost in Lean River Basin



Can validate VIC and PWBM models with International Permafrost Association's International Polar Year Thermal State of Permafrost (TSP) observations

NASA project: Permafrost Dynamics within the Northern Eurasia Region and Related Impacts on Surface and Sub-Surface Hydrology, PI: V. E. Romanovsky

*Romanovsky et al., 2010, Permafrost and Periglacial Processes*

# Wetland Model Intercomparison over West Siberia

- Bohn et al (in preparation)
- Analyze results of the WETCHIMP wetland model intercomparison project (Melton et al., Biogeosciences, 2013)
- Compare to:
  - In situ CH<sub>4</sub> observations of Glagolev et al. (2011)
  - Remotely sensed observations of inundation, saturation (Schroeder et al., 2010; Papa et al., 2010; Bohn et al., 2013)
- Overarching Question:
  - What is the present state of large-scale modeling of boreal wetland methane emissions?
- Subsidiary Questions:
  - How sophisticated must a wetland model be to reproduce observed large-scale CH<sub>4</sub> emissions?
  - How much error comes from estimates of contributing area vs. per-unit-area CH<sub>4</sub> fluxes?

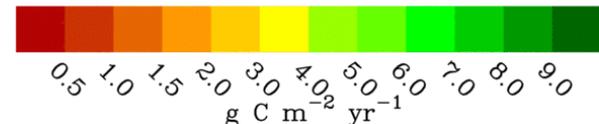
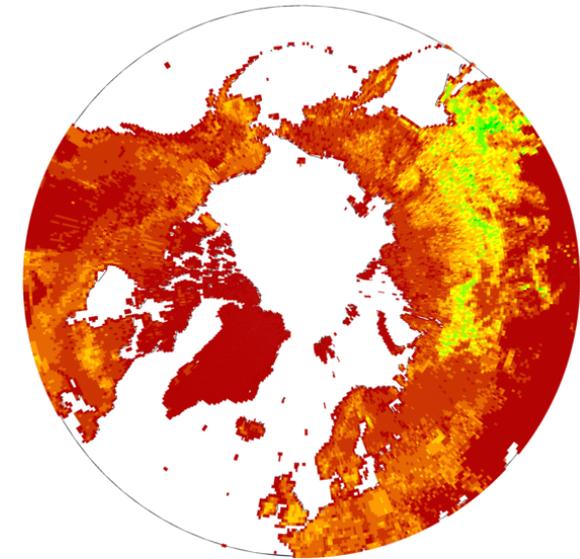
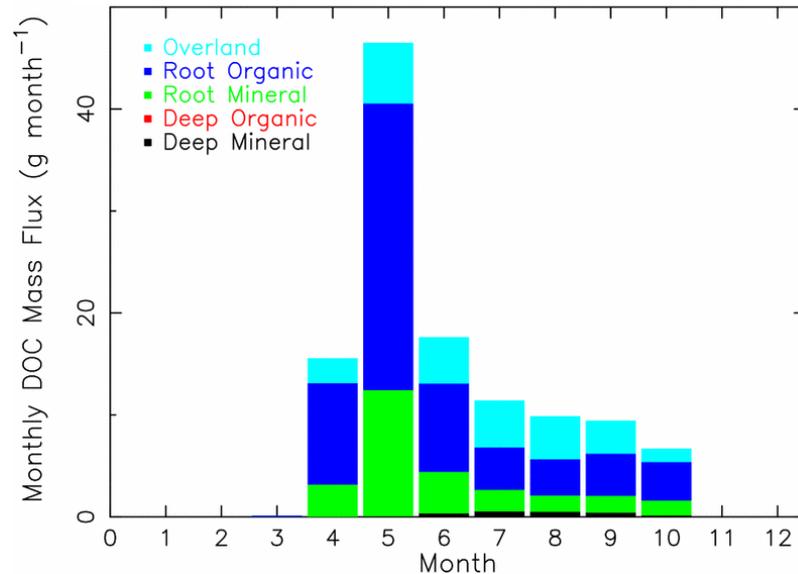
## Project Next Steps

- **Incorporate DOC leaching into VIC lakes model**
- **Use in situ soil temperature observations to validate model estimate of freeze/thaw dynamics**
- **Link FAREAST vegetation stand model with VIC in interactive simulation**
- **Apply model framework to full NEESPI region**
- **Synthesis of results**

# Methodology for DOC leaching

- Follows recent work using TEM6 model
- Incorporate GPP/NPP and landcover from remote sensing data products
- Parameterize DOC leaching as a function of soil temperature, soil moisture, density of soil carbon in model layer(s)
- Route water through stream networks of river basins to Arctic ocean

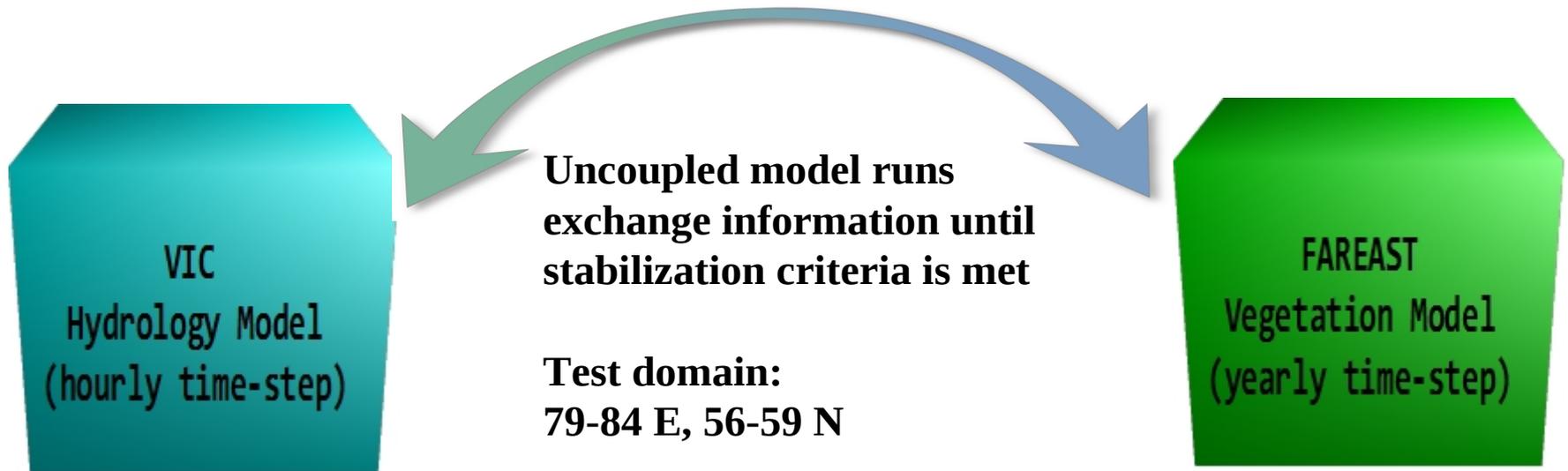
## TEM6 DOC Leaching Rates



Initial tests of DOC leaching as a function of water yield using Pan-Arctic water Balance Model (Rawlins, 2003)

*data from collaborators A. D. McGuire and Dan Hayes*

# Coupling of VIC and FAREAST Vegetation Model



## Inputs from FAREAST

- Dynamic forest cover statistic-forest areal extent, species
- percentage, average tree height, leaf area index (LAI)
- Soil water content

## Outputs to FAREAST

- Evapotranspiration output
- Soil moisture percentiles
- Carbon fluxes

## Inputs from VIC

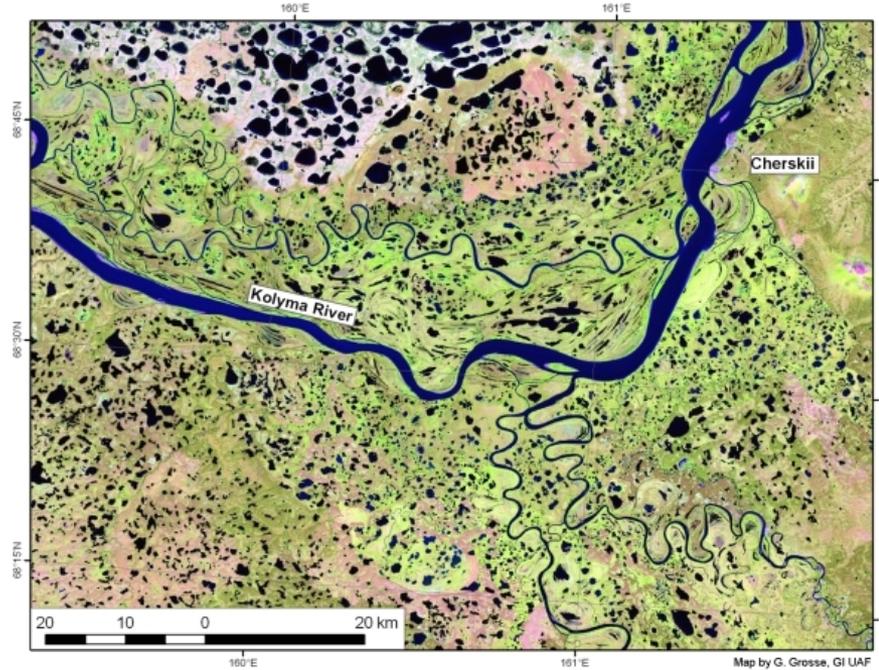
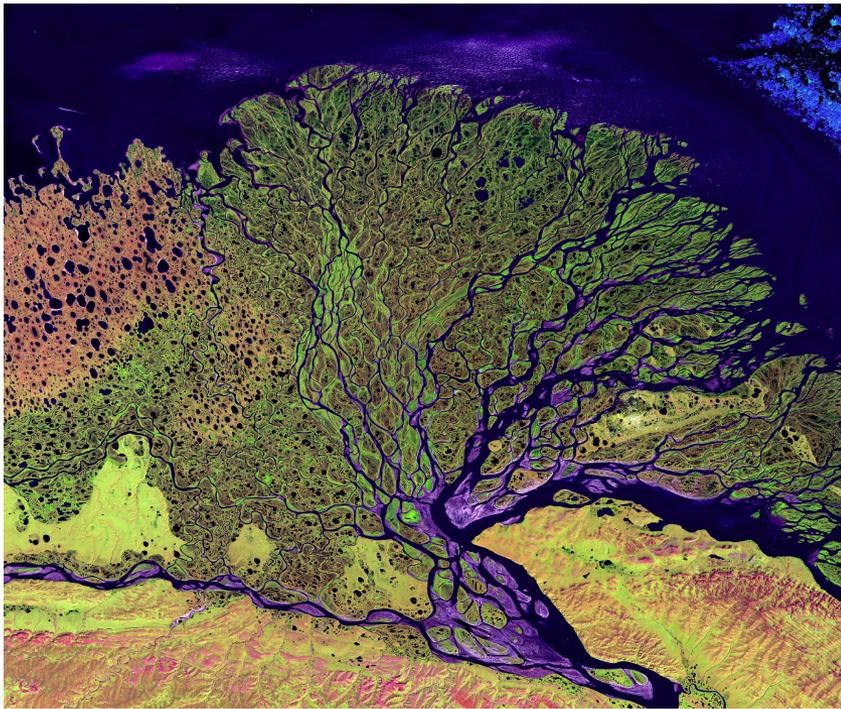
- Evapotranspiration (mapped photosynthesis and species)
- Soil moisture
- Carbon fluxes for forest domain

## Outputs to VIC

- Dynamic forest cover statistics (% of grid cell defined as 'forest')
- Soil water content

# Major Research Challenge: upscaling methane fluxes from thermokarst lakes

Efforts are needed to better understand the relationship between soil and peat carbon inputs to lakes via thermokarst erosion and methane emissions from lakes at the regional scale.



Map by collaborator Guido Grosse, U. Alaska-Fairbanks

The Lena River Delta, dominated by Yedoma uplands and thermokarst lakes. Image taken by LANDSAT (source: NASA).

<http://geolog.edu/2013/03/25/imaggeo-on-mondays-alas-allases-are-abound/>

