

Assimilation of Tower and Satellite-Based Methane Observations for Improved Estimation of Methane Fluxes over Northern Eurasia

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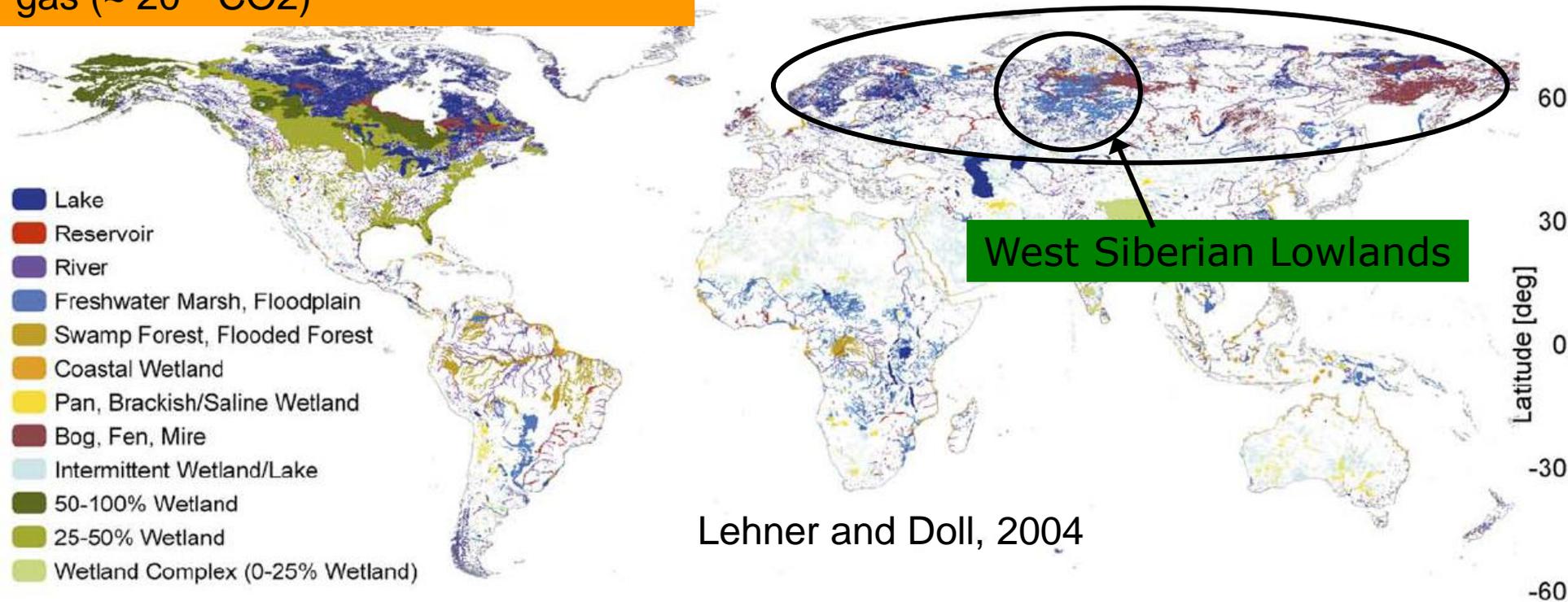
Methane and Northern Eurasia

Lakes and wetlands are the world's largest natural source of methane

Methane is very powerful greenhouse gas (~ 20 * CO₂)

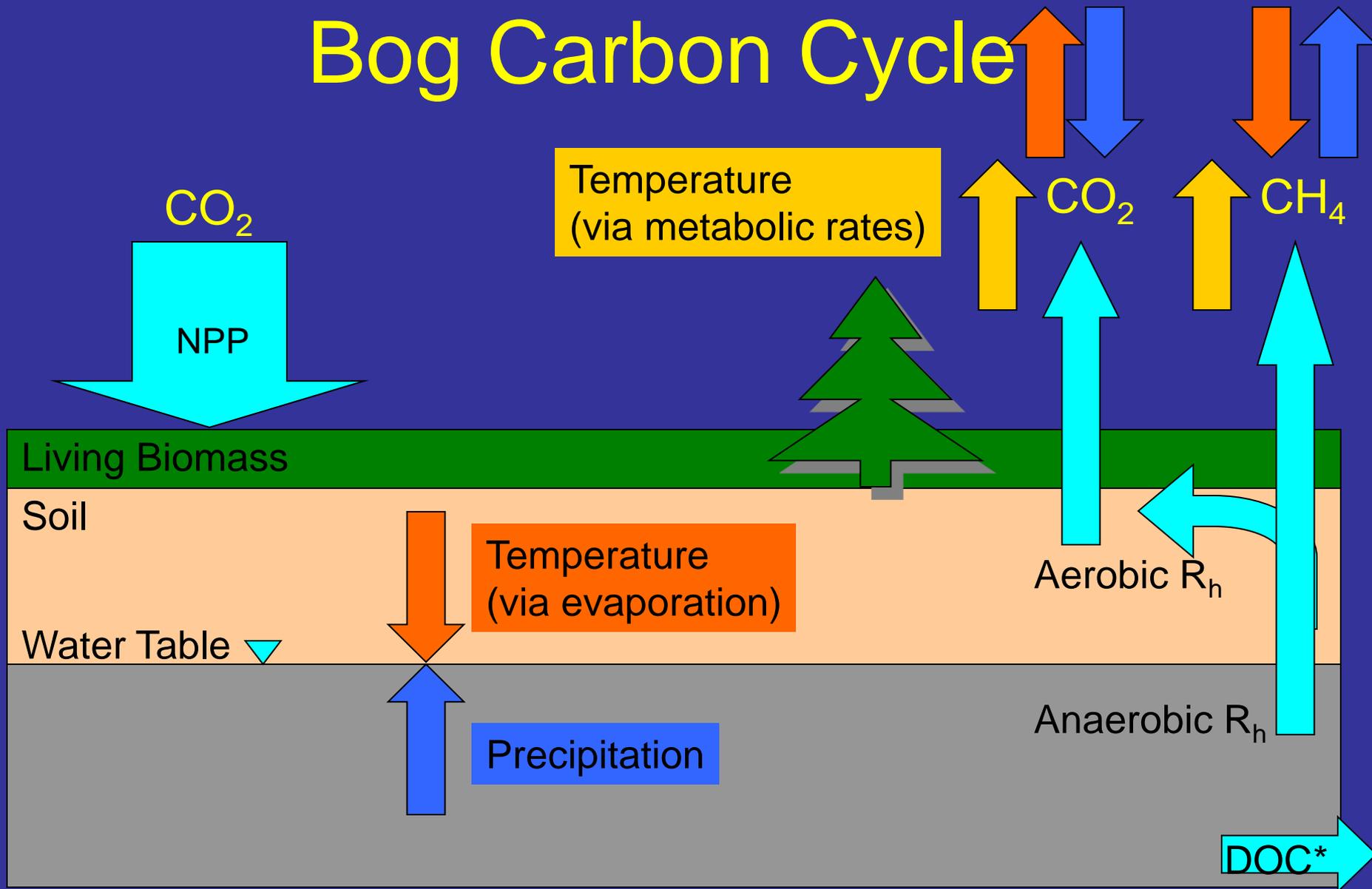
Northern Eurasia contains:

- 30% of world's wetlands (Gorham, 1991)
- Large portion of world's lakes
- Vast C pool in soil



High latitudes experiencing pronounced climate change: potential climate feedback

Bog Carbon Cycle



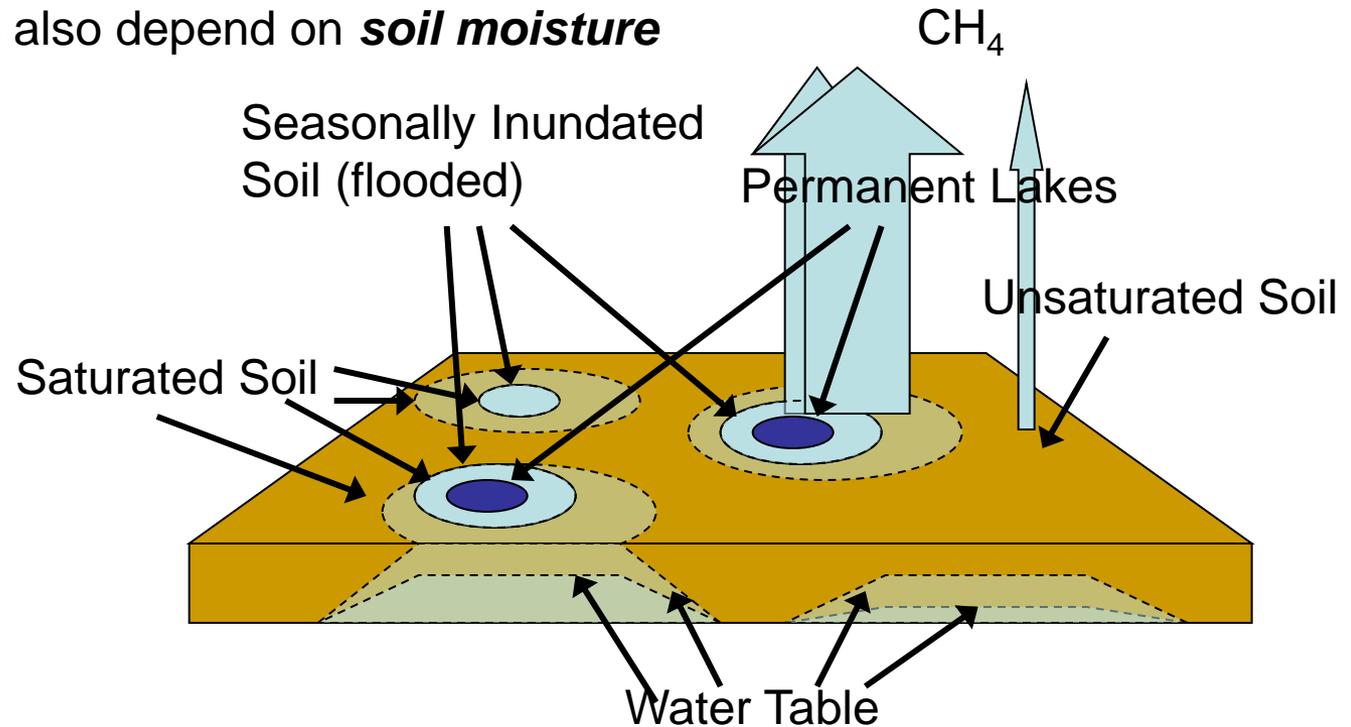
C fluxes also depend on soil C profile, pH, redox

*Note: currently not considering export of DOC from soils

Lakes, Wetlands, and Methane

- Lake/wetland CH₄ emissions depend on T, C, nutrients, oxidation state, etc

- Wetland CH₄ fluxes also depend on **soil moisture**



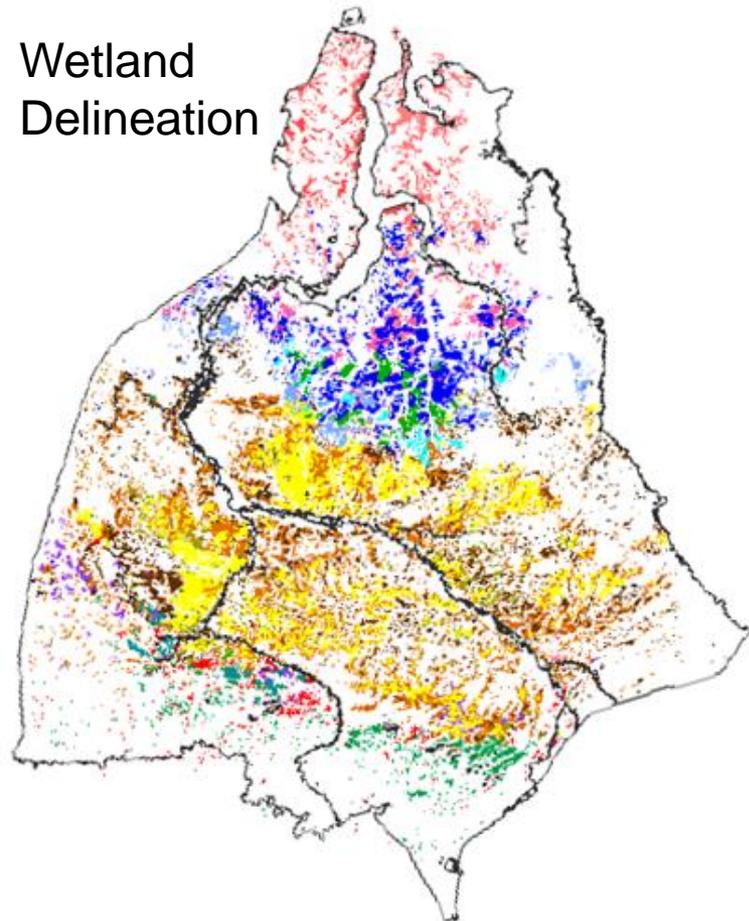
- Areal extent of wet zones can vary substantially in time***
- Areal extents are poorly-constrained***
- CH₄ emissions rates are poorly-constrained***

Emissions components & Uncertainties

<i>Component</i>	<i>Area</i>	<i>Emission Rate</i>
Lakes	Underestimated by GLWD – factor of 2?	Poorly Constrained – 2 orders of magnitude
Saturated / Inundated Wetlands	Poorly-Constrained	+/-10% in W. Siberia
Unsaturated Wetlands	Water table distribution poorly constrained	+/- 10% in W. Siberia

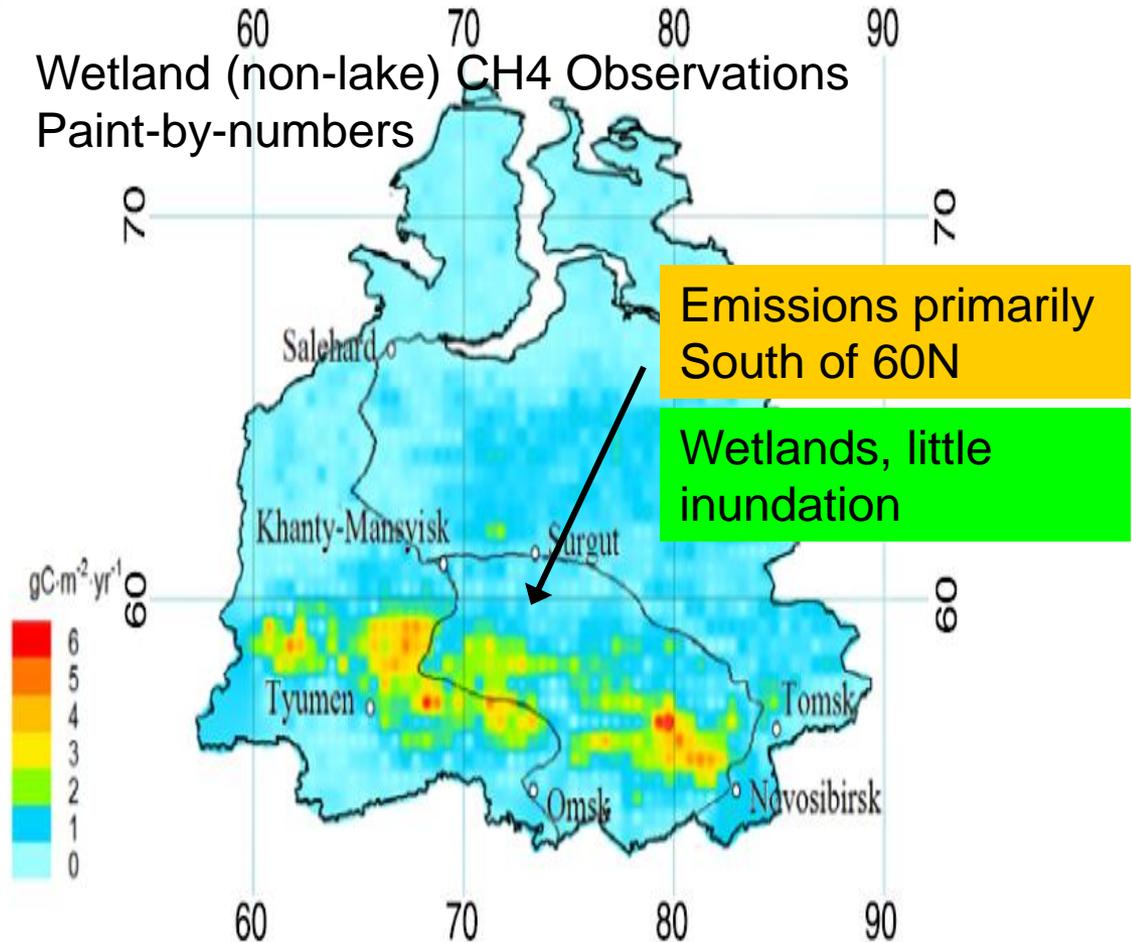
Bottom-Up

Recent intensive field campaigns sampled Areas, CH₄, Zwt, T of microforms across W. Siberia



Peregon et al., 2009

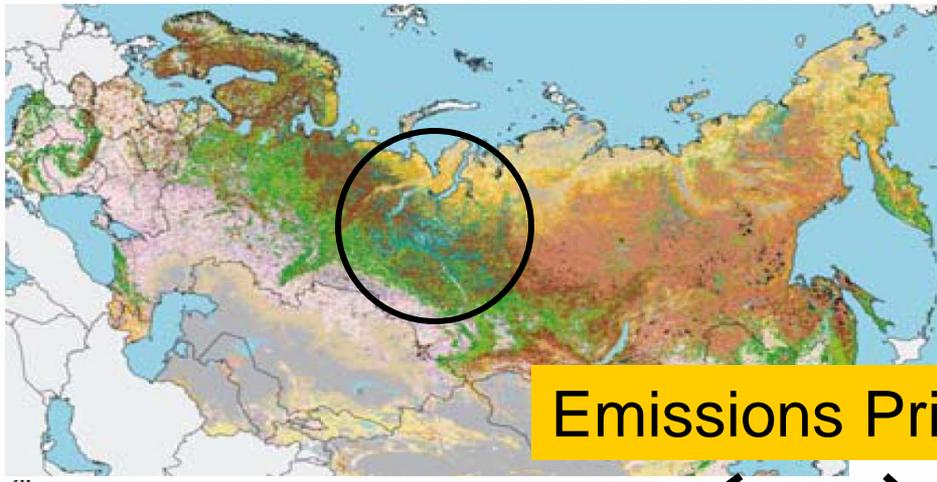
Wetland (non-lake) CH₄ Observations
Paint-by-numbers



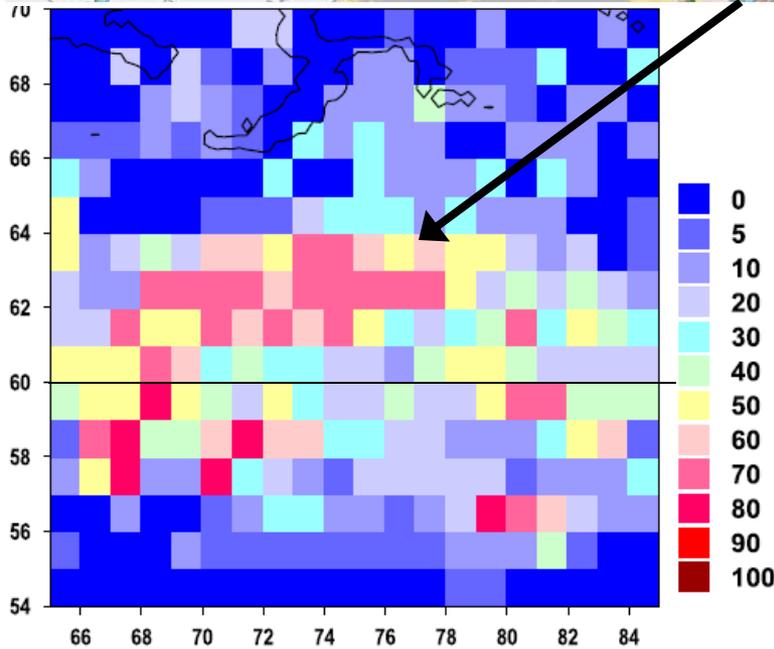
Glagolev et al., 2011

3.96 +/- 1.3 Tg CH₄/y

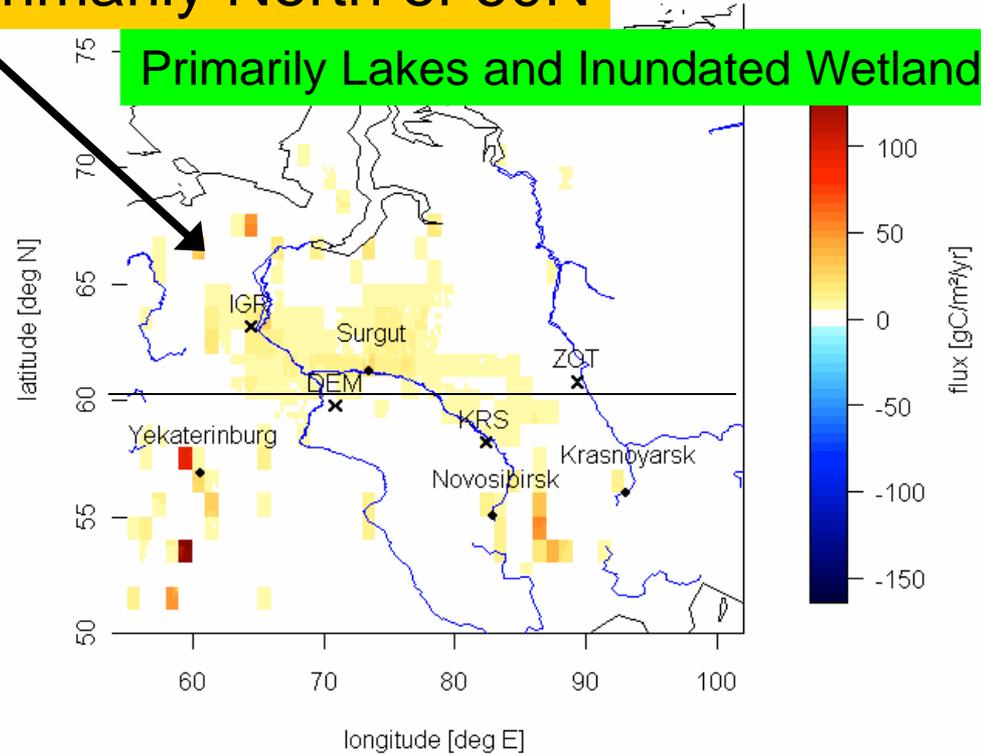
Top-Down



Emissions Primarily North of 60N



Primarily Lakes and Inundated Wetlands



Matthews and Fung, 1987
(reprinted from Kim et al., 2011)
6.3 Tg CH₄/year

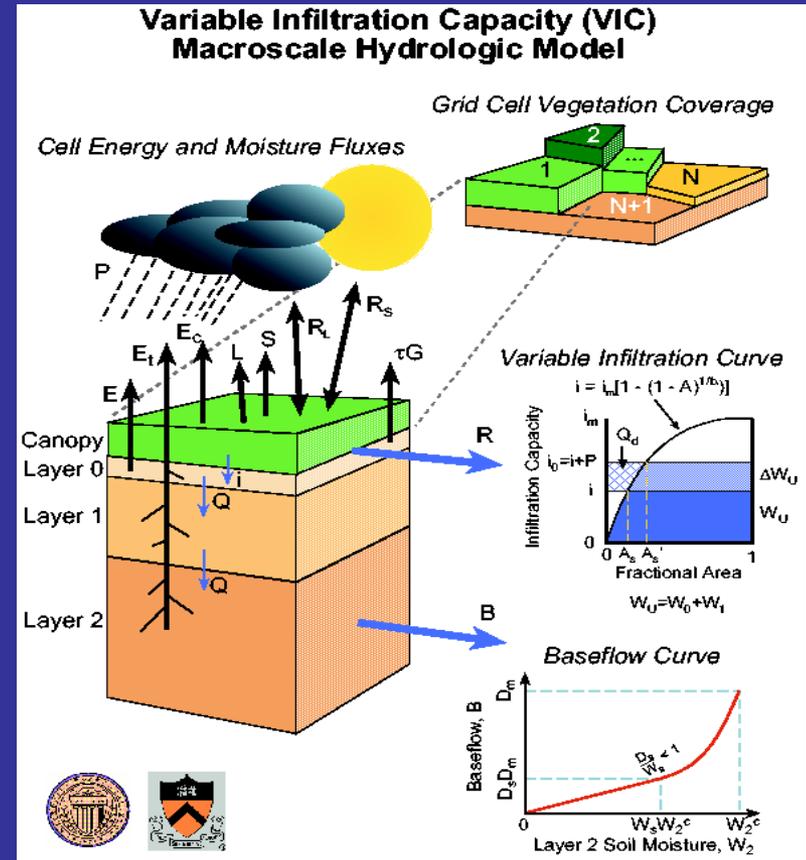
Inverse modeling from tower network:
11.2 +/- 1.4 TgCH₄/year
(Winderlich PhD Thesis, 2012)
(Spatial pattern inferred from forest cover)

Can We Reconcile Top-Down and Bottom-Up Estimates?

- Use combination of:
 - Land surface model (with carbon)
 - Atmospheric Transport model
 - In Situ observations
 - Satellite Observations
- Take Bayesian approach

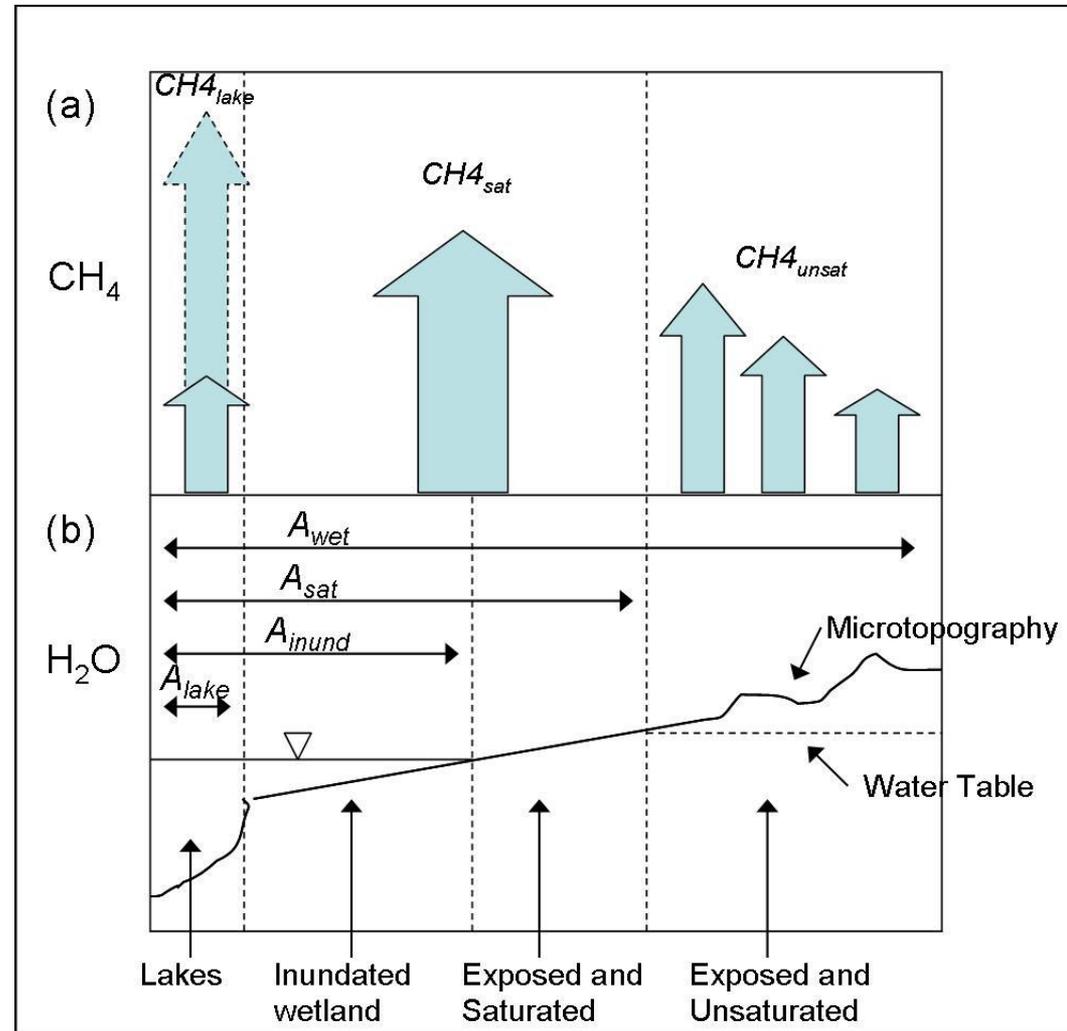
Modeling Framework

- 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
 - Soil Respiration
 - Other hydrologic variables...
- Link to CH4 emissions model (Walter & Heimann 2000)

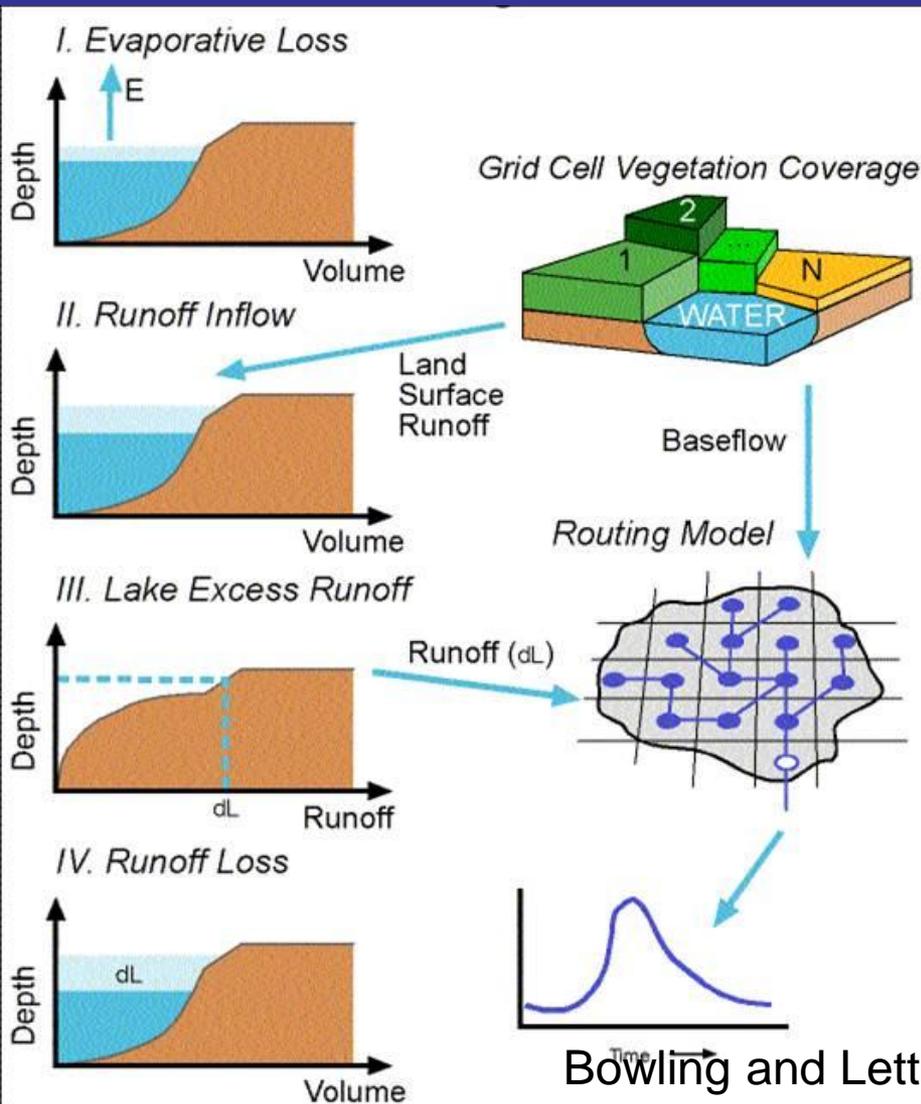


VIC's Lake-Wetland Continuum

- Dynamic Lake Model
- Seasonal Flooding of Wetlands
- Distributed water table depth in wetlands
 - Saturated zone extends beyond inundation
 - Unsaturated zone's water table depth is a function of microtopography
- Each zone has separate methane emissions



VIC Dynamic Lake/Wetland Model

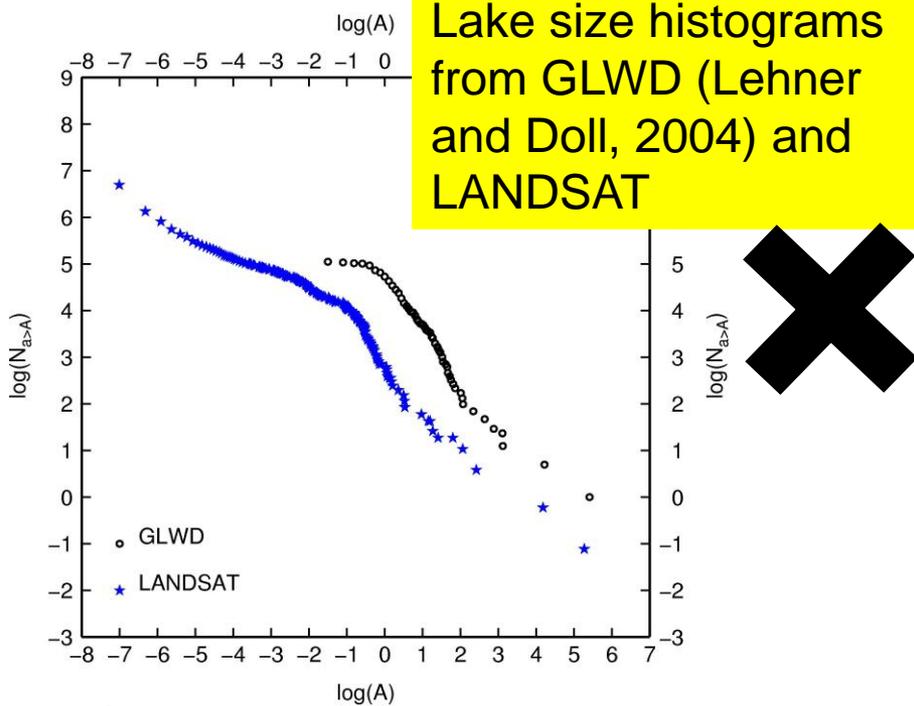


- Water & energy balance model
- Includes mixing, ice cover
- Dynamic area based on bathymetry
- Can flood surrounding wetlands based on topography

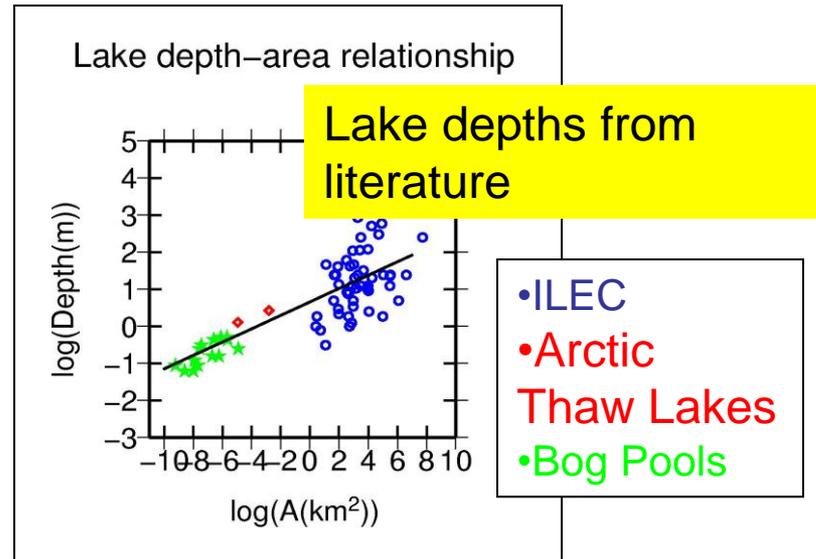
Special application: treat all lakes, ponds, and inundated wetland area as a single “lake”

Lake Bathymetry/Topography

Lake $\log(N_{a>A})$ v $\log(A)$ (km^2)
55.5–56.5 N, 70.75–73.25 E



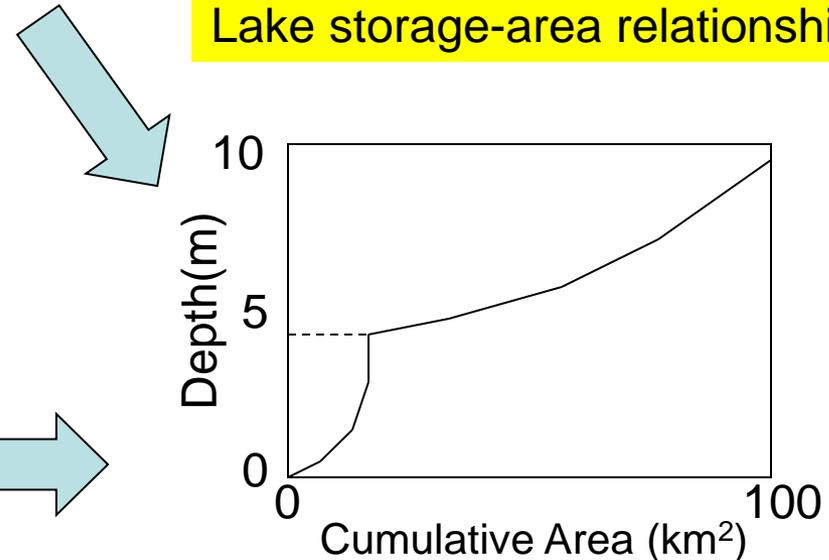
Lake size histograms from GLWD (Lehner and Doll, 2004) and LANDSAT



Lake depths from literature

- ILEC
- Arctic Thaw Lakes
- Bog Pools

Lake storage-area relationship

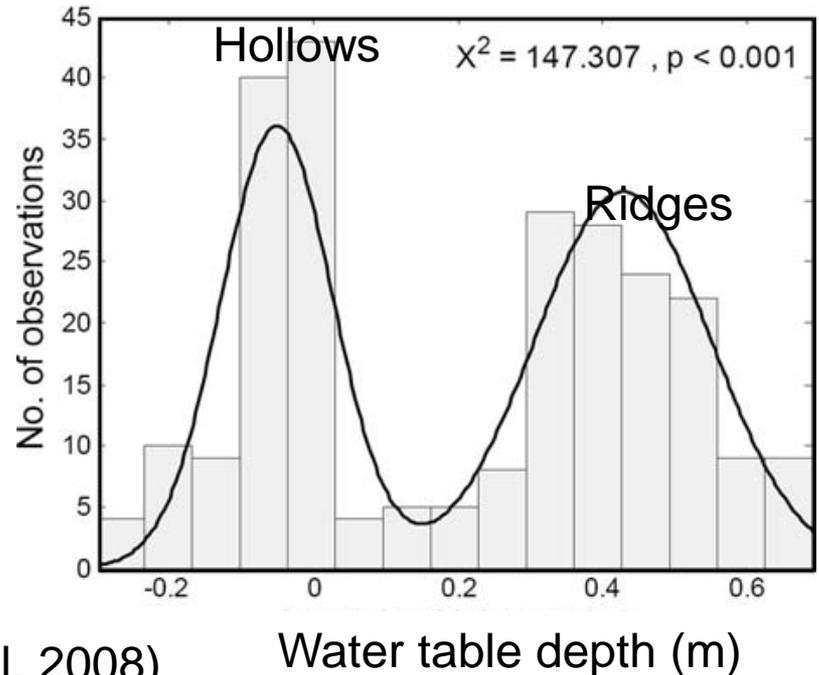
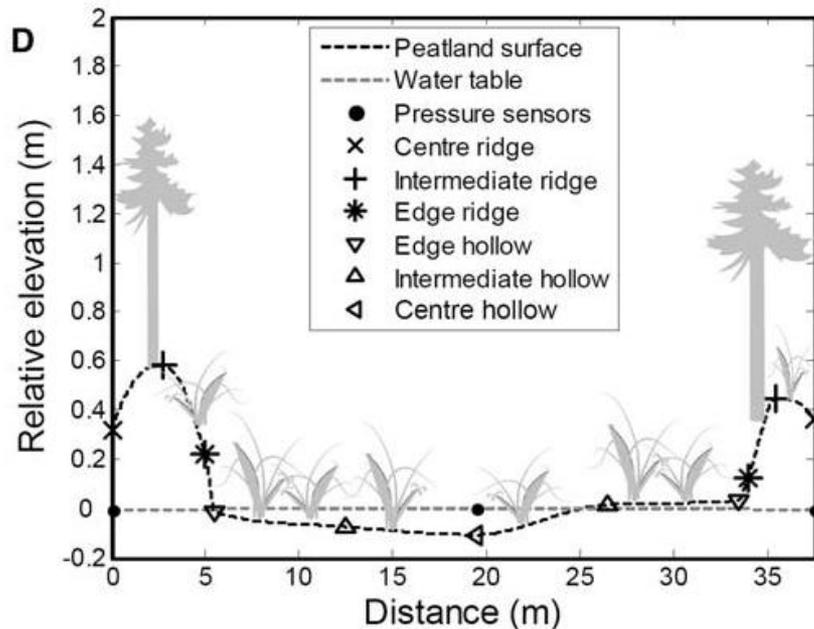


LANDSAT
courtesy of E.
Podest and N.
Pinto of NASA/JPL

SRTM and ASTER
DEMs for surrounding
topography

Distributed Water Table

- Exposed wetland is composed of a mix of ridges and hollows
- Ridges have water table depth up to 50 cm deeper than hollows
- Mix of hollows and ridges is calibratable
- Bayesian calibration against observations indicates ridge fraction of landscape is 25%-60%, median approx 50%



(Eppinga et al, 2008)

CH₄ Emissions

Based on Walter-Heimann (2000) wetland methane emissions model

Function of (supplied by VIC):

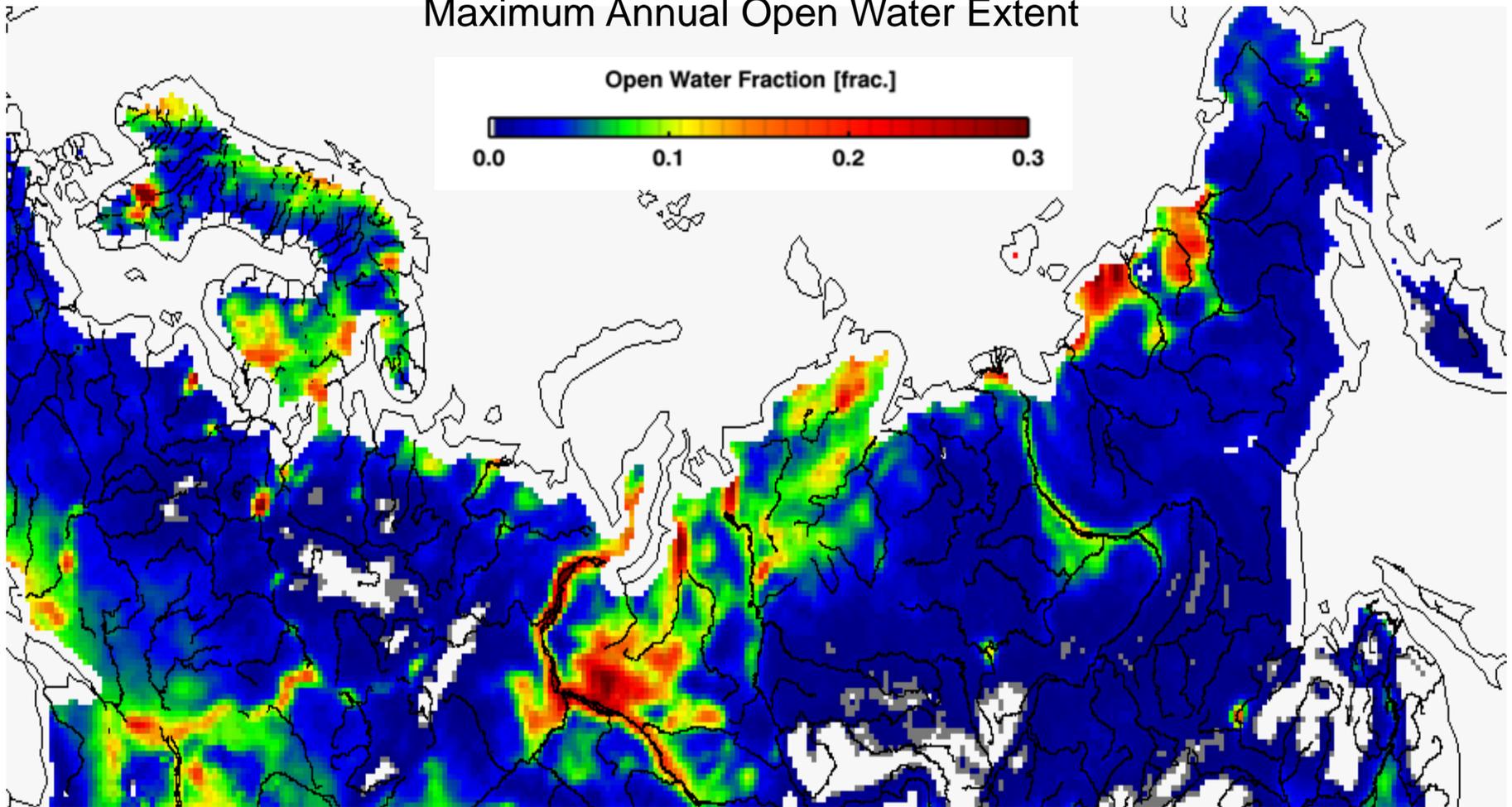
- Water Table Depth
- Soil Temperature
- Net Primary Productivity
- Soil Carbon Pool size

Converting Emissions into Concentrations

- Link VIC emissions estimates to the NIES Atmospheric Chemistry and Transport Model (ACTM)
- ACTM is driven by NCEP-DOE Reanalysis 2 fields
- Global simulations at 2.5 degree resolution (15 atmospheric levels)
- Global emissions taken from Matthews and Fung 1987 but with coefficients from inversion of Patra et al 2009
- In West Siberia, use VIC emissions instead

AMSR/QSCAT-Derived Inundation

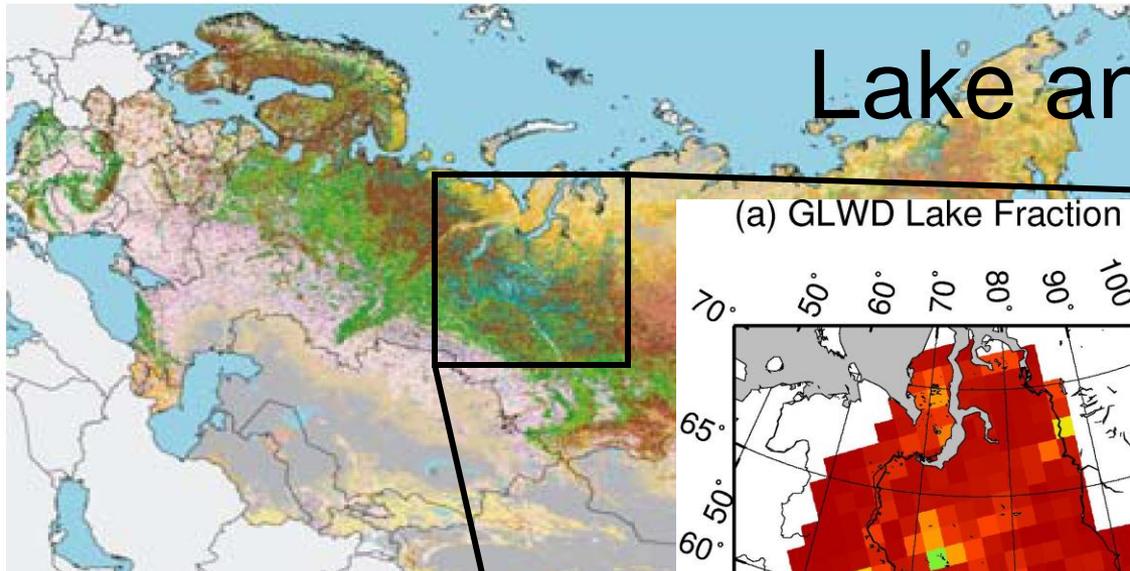
Maximum Annual Open Water Extent



- Daily, for snow-free days
- 2002-present
- 25km resolution

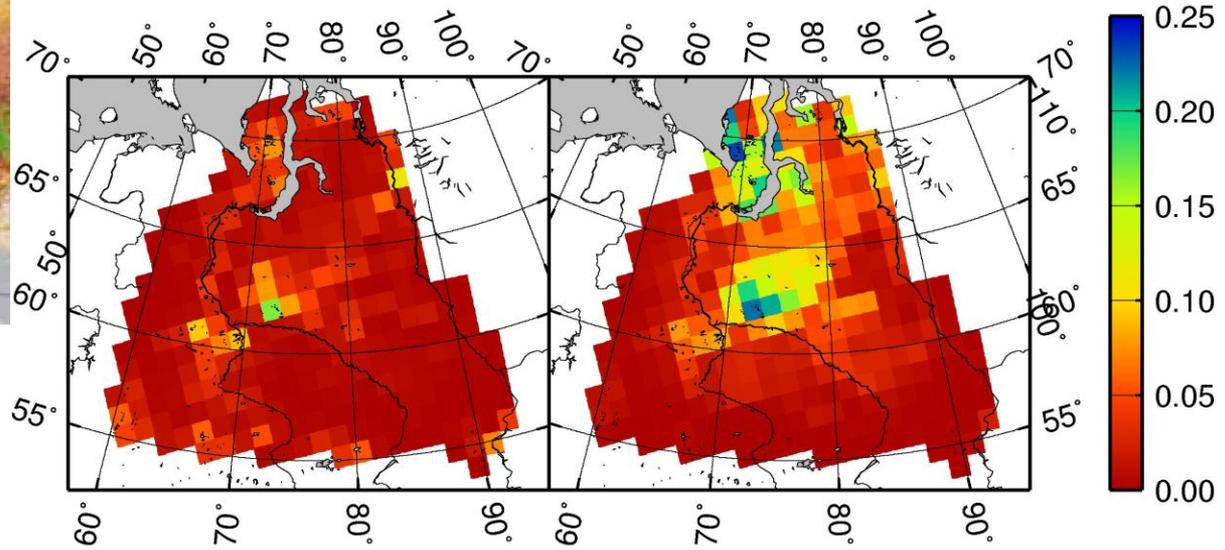
Courtesy R. Schroeder, NASA/JPL

Lake and Wetland Areas



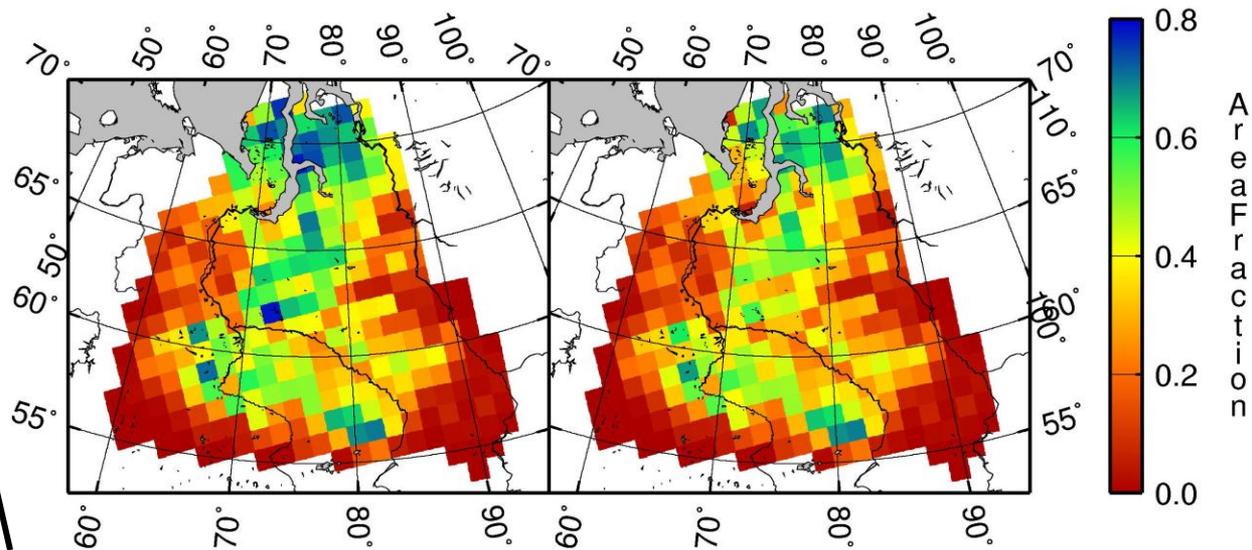
(a) GLWD Lake Fraction

(b) AMSR Lake Fraction



(c) Total Lake&Wet Frac

(d) (Total – AMSR Lake)



AMSR-based lake areas:
“Permanent” lake extent =
Minimum monthly average
surface water extent from
AMSR time series

GLWD (a) and AMSR (b)
lake areas have different
spatial distributions.

Wetland distribution (d) is
different from either lake
distribution.

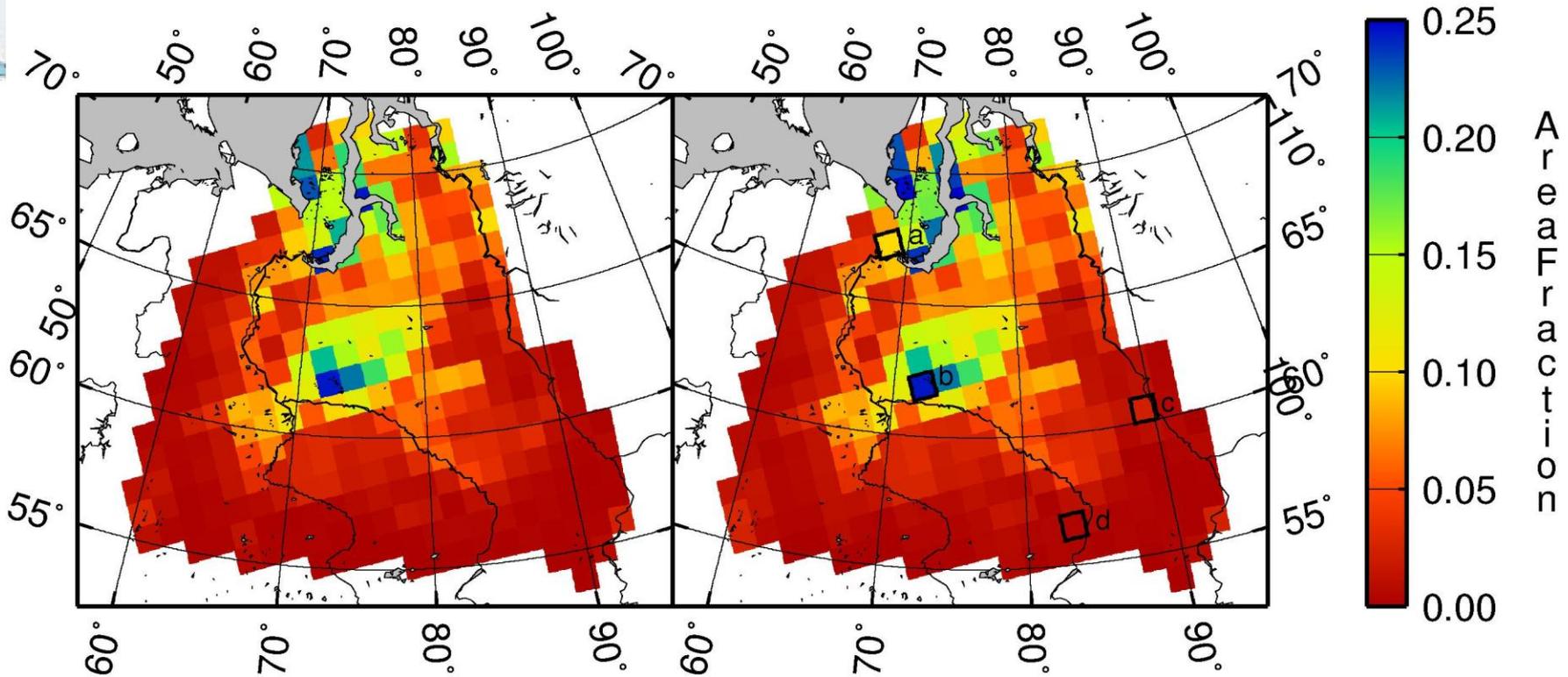
Inundated Area – Obs and Sim



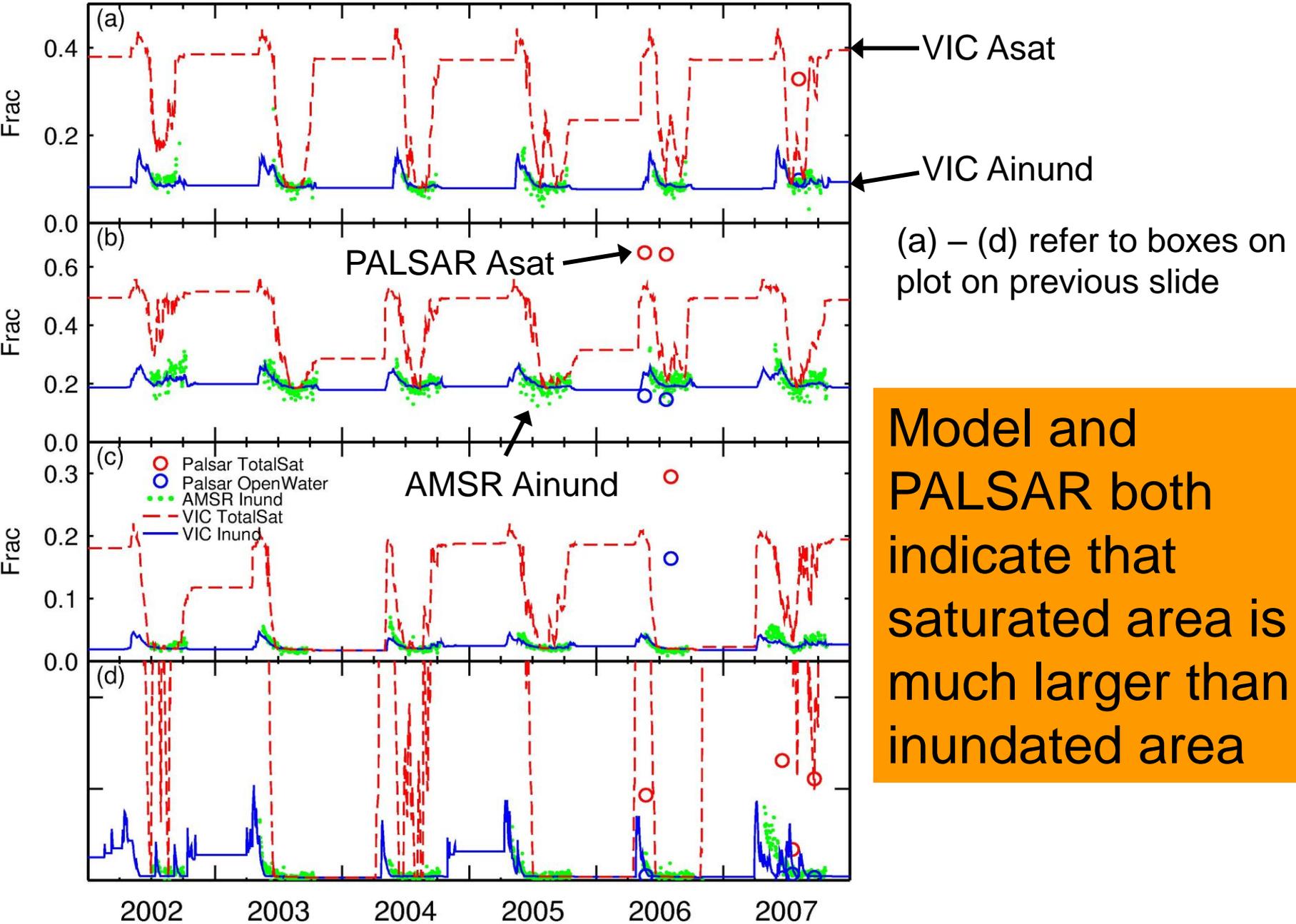
1st to 99th percentiles of A_{inund} are $\pm 10\%$ of median

(a) AMSR JJA Inund. Fraction

(b) VIC JJA Inund. Fraction

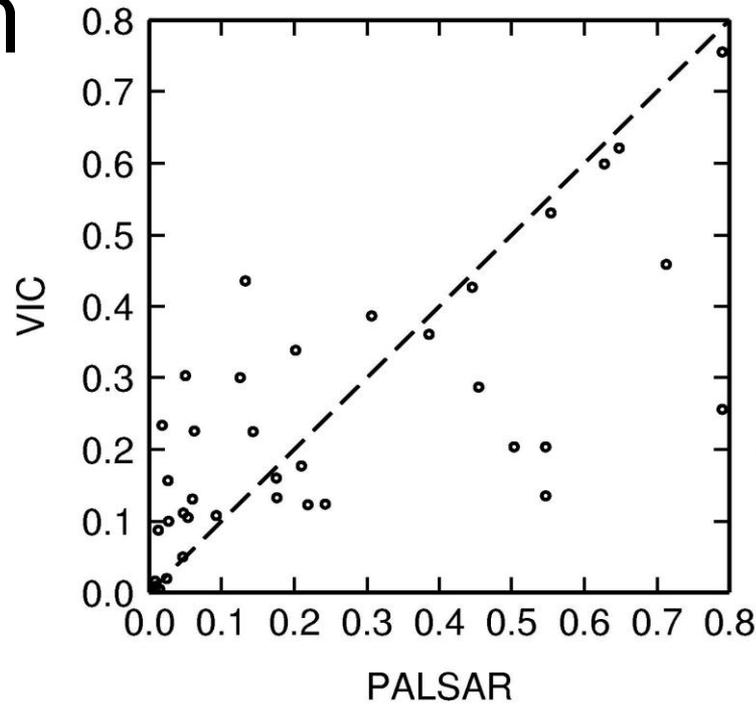


Timeseries of Ainund and Asat



Asat: Sim v. Obs

(a) VIC Asat v. PALSAR Asat



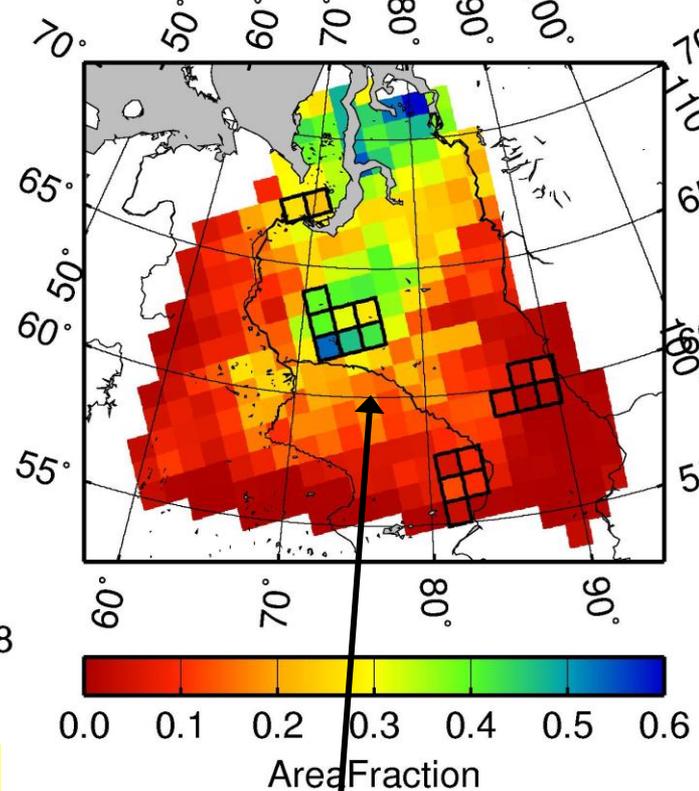
Simulated saturated area appears to be biased low by about 6%

But LARGE scatter

Assume:

- Median Asat = VIC Asat * 1.06
- 1st pctl Asat = Ainund
- 99th pctl Asat = Awetland

(b) VIC Asat (bias-corrected)



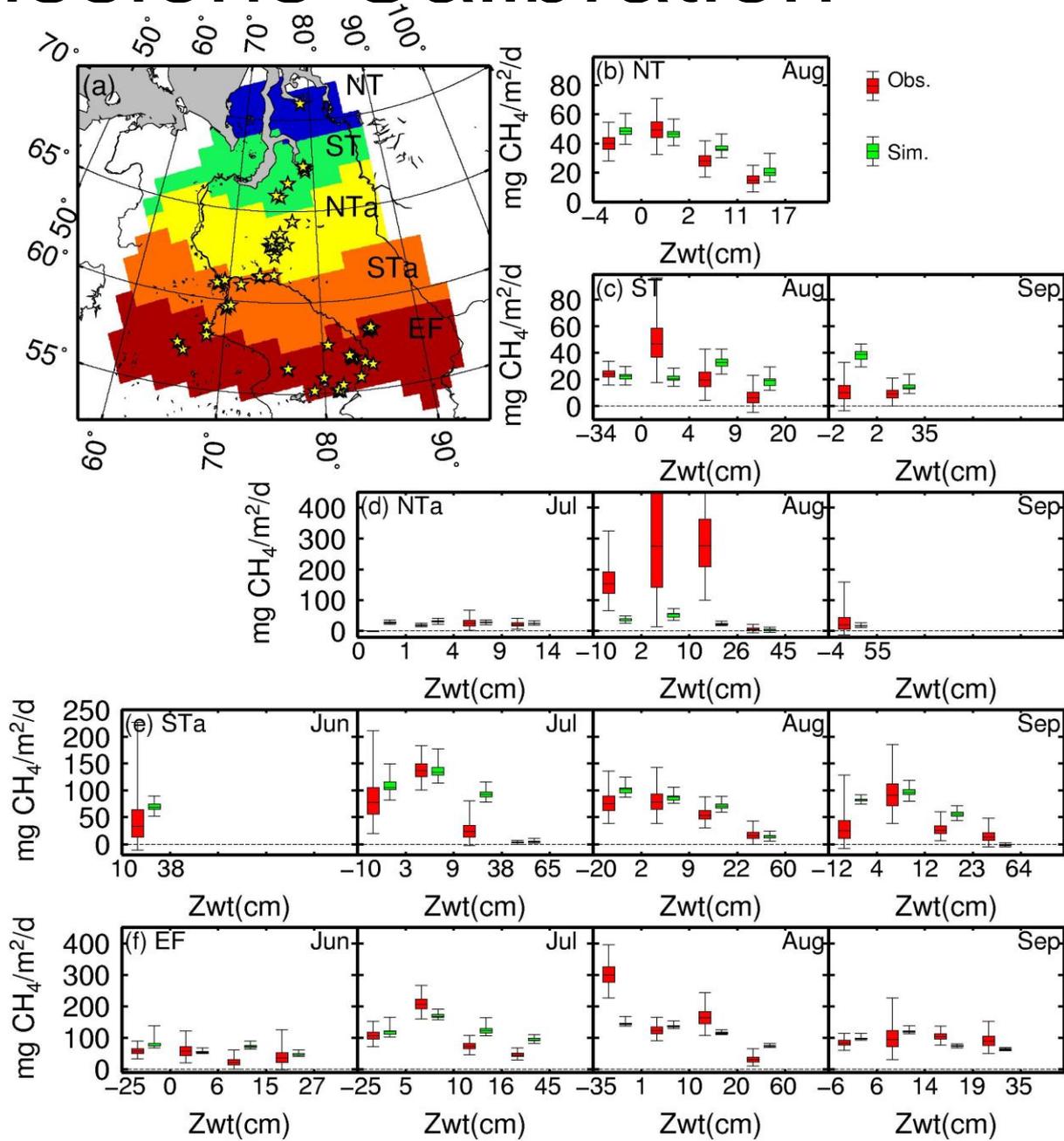
Large saturated area
North of 60N

CH₄ Emissions Calibration

Calibrated to match observations of Glagolev et al 2011

Large scatter & mismatch in NTa (region d) in August is due to very high observed emissions at a single site

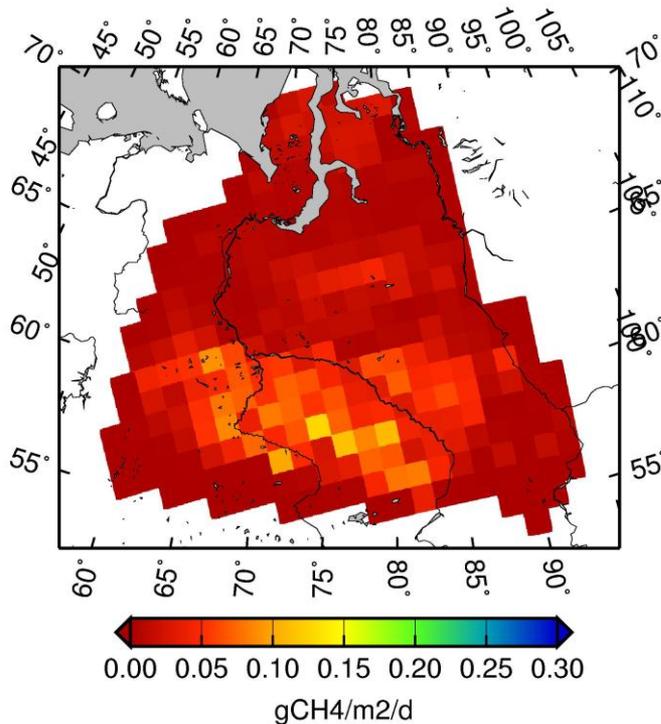
Wetland methane emissions decrease from South to North



Wetland Emissions

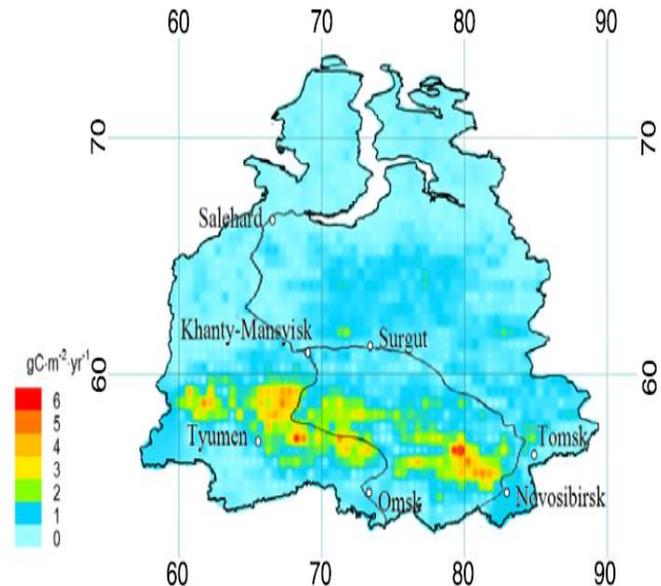
- Spatial pattern looks similar to Glagolev et al 2011 paint-by-numbers
- Implies that our use of distributed water table is distributing emissions similarly to actual distribution of microtopography

Jul Avg Emissions



Median emissions:
4.17 Tg CH₄/year

Min, Max
3.42 Tg CH₄/year
6.92 Tg CH₄/year



Glagolev et al (2011)
3.96 +/- 1.4 Tg CH₄/year

What about lake areas and emissions?

Consider the 2 lake area sources (GLWD, AMSR) as upper and lower bounds

Consider range of constant emission rates per unit area, spanning range reported in literature

- 10 mg CH₄/m²/day
- 125 ...
- 250 ...
- 375 ...
- 500 ...
- These nominal rates apply during ice-free season

Construct representative combinations of lake areas and emissions, wetland areas and emissions, and compare each “scenario” with AIRS satellite retrievals

Emissions “Scenarios”

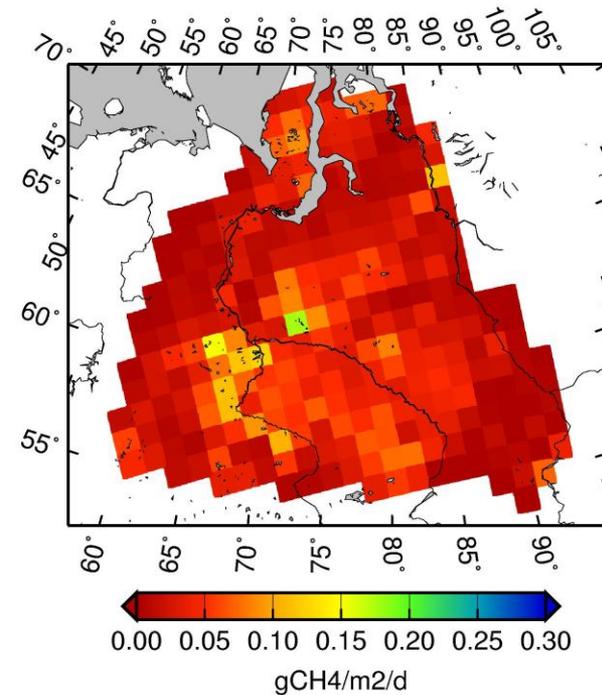
The various “scenarios” amount to linear combinations of 3 main end-members:

1. High Lake Emissions (500 mg/m²/day), GLWD Lake Area, 1st pctl wetland CH₄

2. High Lake Emissions (500 mg/m²/day), AMSR Lake Area, 1st pctl wetland CH₄

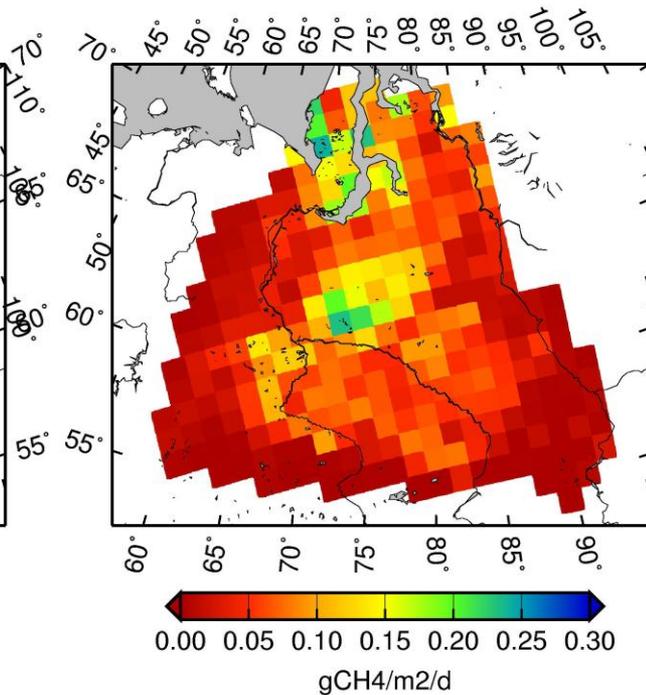
3. Low Lake Emissions (10 mg/m²/day), Median Wetland Emissions

Jul Avg Emissions



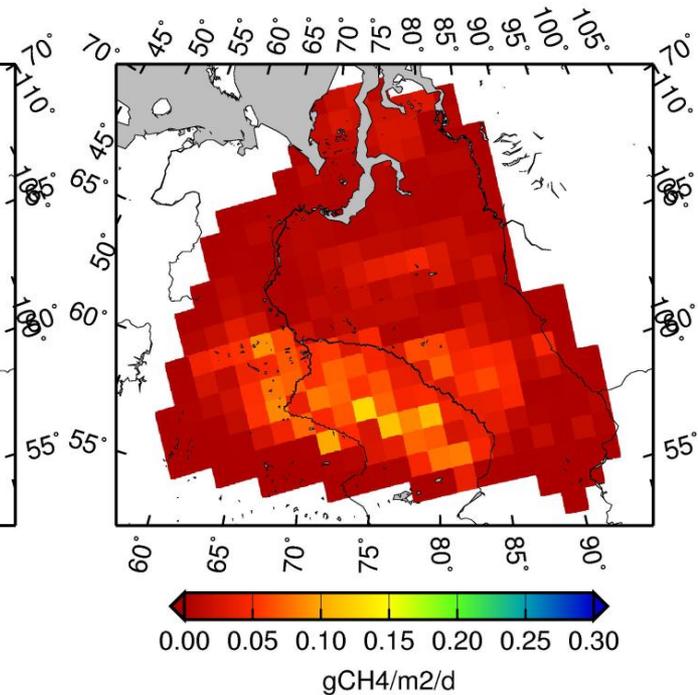
Annual emissions ~ 4.6 Tg CH₄/year

Jul Avg Emissions



Annual emissions ~ 14.1 Tg CH₄/year

Jul Avg Emissions



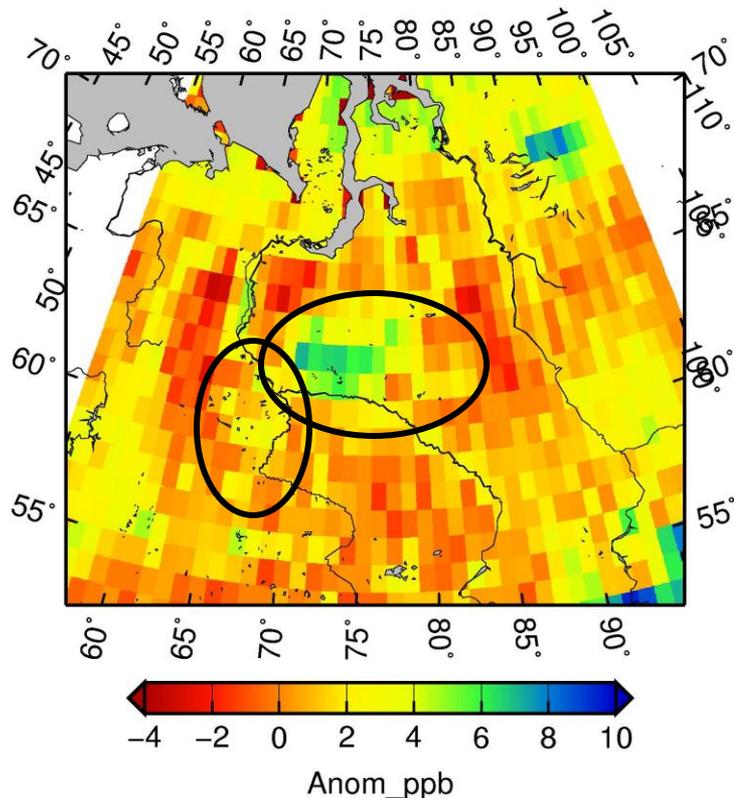
Annual emissions ~ 4.3 Tg CH₄/year

Comparison to Satellite CH₄

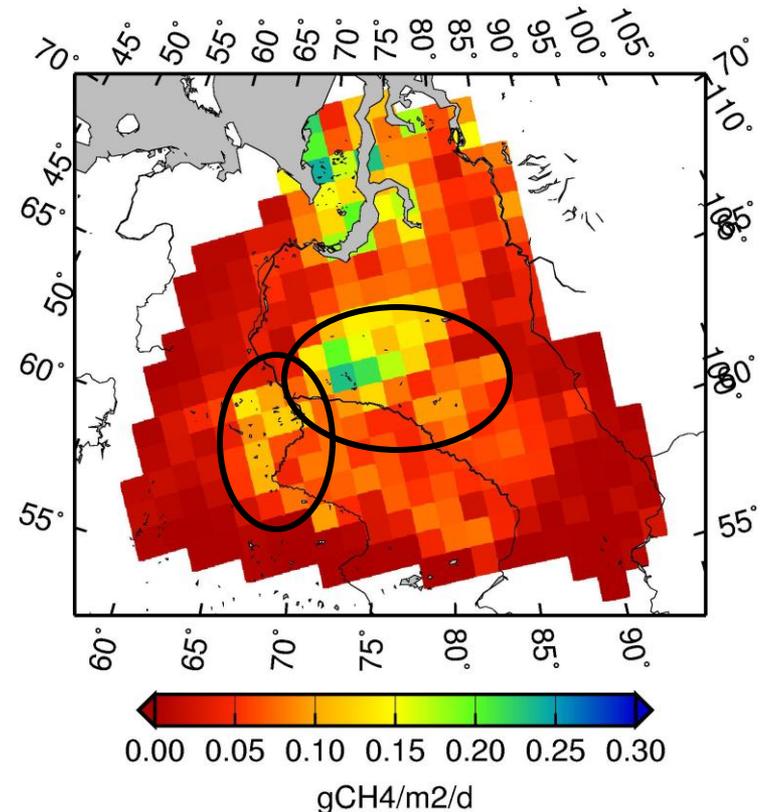
Routing through atmospheric transport model and comparison with AIRS is underway

But if we compare the spatial patterns of emissions with AIRS [CH₄] zonal anomalies:

AIRS CH₄ Zonal Anomalies, JJA 2003–2010



Jul Avg Emissions



- Scenarios with AMSR lake area and high lake emissions rates (e.g., similar to end-member #2) give most plausible spatial distribution of emissions
- This implies lake emissions around 250-500 mgCH₄/m²/day
- Interpret with caution, since [CH₄] affected by advection and oxidation in atmosphere

Posterior Probabilities

- AMSR lake areas seem more likely than GLWD lake areas
- Lake emissions range from 250-500 mg/m²/day, median = 375 mg/m²/day
- This similar to thermokarst lake emission rates

Total Emissions Estimates

	Min	Median	Max
Wetland	1 st pctl Asat 1 st pctl CH4 3.4 Tg CH4/year	Median Asat Median CH4 4.2 Tg CH4/year	99 th pctl Asat 99 th pctl CH4 6.4 Tg CH4/year
Lake	AMSR area 250 mg/m ² /day 5.4 Tg CH4/year	AMSR area 375 mg/m ² /day 8.1 Tg CH4/year	AMSR area 500 mg/m ² /day 10.7 Tg CH4/year
Total	8.8 Tg CH4/year	12.3 Tg CH4/year	17.1 Tg CH4/year

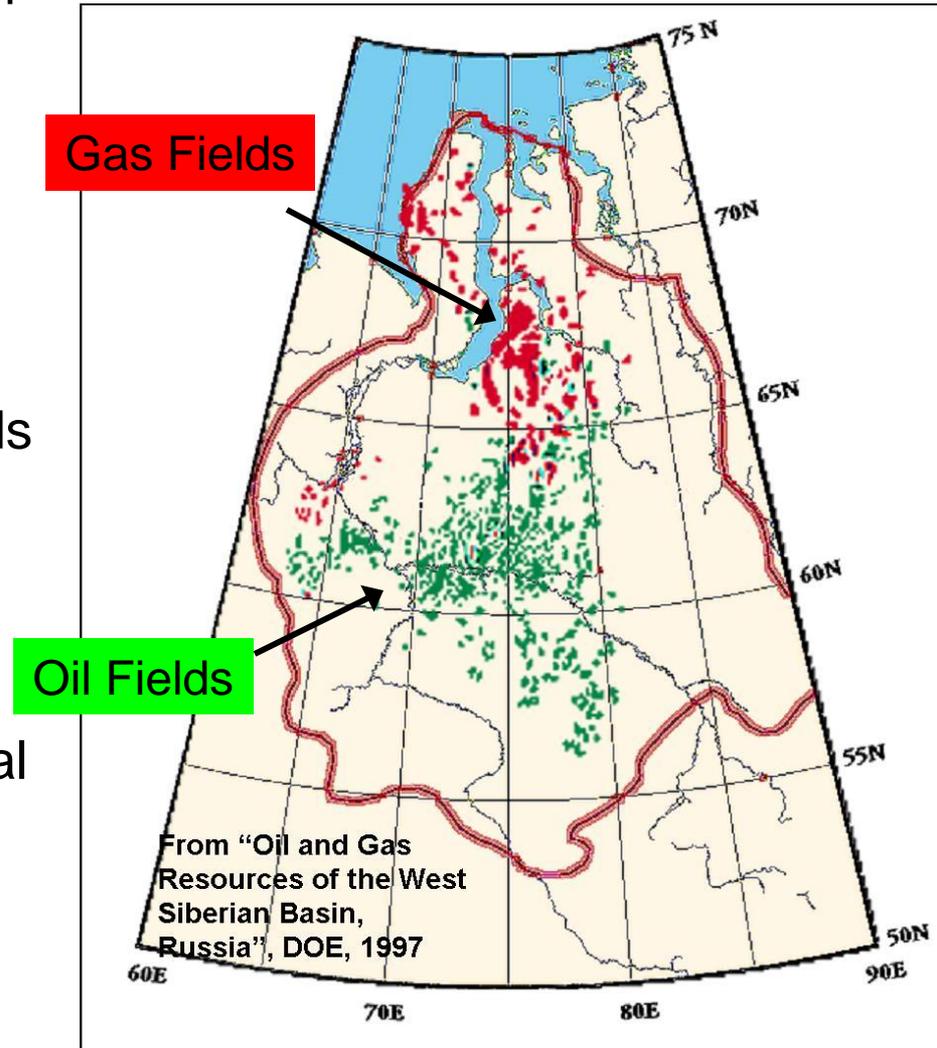
Other possible sources of CH₄?

- **Natural seeps** have been observed in at least one location in W. Siberia; globally associated with oil and gas fields
- Oil and gas fields have similar distribution to lakes in W. Siberia

However:

- Natural gas fields (red) are primarily North of area of maximum [CH₄]; fields in the area of maximum [CH₄] are primarily oil (green)
- Oil fields also occur South of the Ob, where we do not see similarly large [CH₄]
- High [CH₄] concentrations over central W. Siberia appear to be seasonal; would natural seeps emit seasonally?

But we can't rule them out



Assimilation Scheme

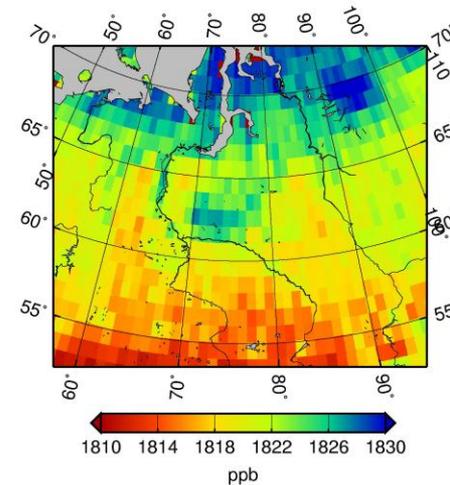
1. Start with ensemble of VIC-ACTM runs, chosen from percentiles of prior joint distribution of surface water and soil carbon



2. Run until observation available

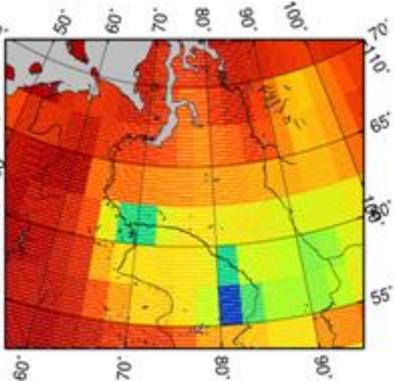


3. Comparison with AIRS Satellite CH4 Observation

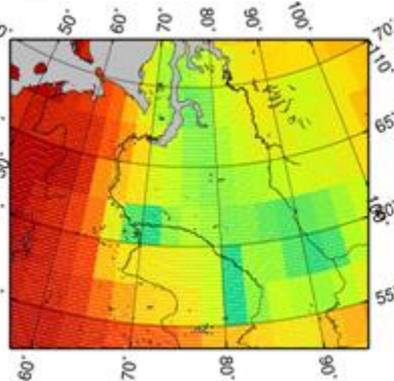


4. Revised likelihoods = posterior distribution

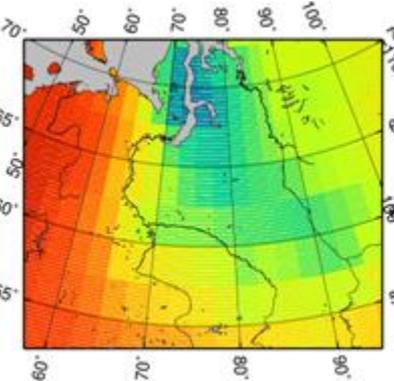
5th



20th



50th



...



5. Run until next observation



Conclusions

- Wetland saturated area is substantially larger than inundated area
 - Important source of CH₄ emissions
 - Still poorly constrained
- Lake areas in W. Siberia likely larger than Global Lake and Wetland Database implies
 - Passive microwave may give better estimates
- Lakes (plus seeps?) in W. Siberia likely emit at rates of 250-500 mg CH₄/m²/day
- W. Siberian lakes (plus seeps?) and wetlands emit between 8.8 and 17.1 Tg CH₄/year
- Assimilation of AIRS CH₄ retrievals into VIC-ACTM is underway

Thank You

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