

# Boreal Arctic Wetland Methane Emissions, 2002-2021

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### Summary

This dataset provides an upscaled estimate of Boreal-Arctic wetland CH4 emissions at a weekly time scale from 2002 to 2021 at 0.5 by 0.5-degree spatial resolution. Ground truth data on wetland CH4 emissions from eddy covariance towers (139 site years) and chambers (168 site years) were used to train and validate a causality-guided machine learning model. The trained model was then used to estimate CH4 emissions at grid cells that have wetlands and located above 44 degrees north. The data are provided in netCDF format.

This dataset includes one file in netCDF format.



Figure 1. Spatial distribution of the long-term averaged wetland CH4 emissions in the Boreal-Arctic upscaled by combining chamber and eddy covariance datasets. Red dashed boxes indicate two wetland hotpots: Hudson Bay lowlands (50-60 deg N, 75-96 deg W) and Western Siberian lowlands (52-74 deg N, 60-94.5 deg E). Source: Yuan et al. (2024).

# Citation

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### 1. Dataset Overview

This dataset provides an upscaled estimate of Boreal-Arctic wetland CH  $_4$  emissions at a weekly time scale from 2002 to 2021 at 0.5 by 0.5-degree spatial resolution. Ground truth data on wetland CH $_4$  emissions from eddy covariance towers (139 site years) and chambers (168 site years) were used to train and validate a causality-guided machine learning model. The trained model was then used to estimate CH4 emissions at grid cells that have wetlands and located above 44 degrees north.

#### Project: Carbon Monitoring System (CMS)

The NASA Carbon Monitoring System (CMS) program is designed to make significant contributions in characterizing, quantifying, understanding, and predicting the evolution of global carbon sources and sinks through improved monitoring of carbon stocks and fluxes. The System uses NASA satellite observations and modeling/analysis capabilities to establish the accuracy, quantitative uncertainties, and utility of products for supporting national and international policy, regulatory, and management activities. CMS data products are designed to inform near-term policy development and planning.

#### **Related Publication:**

Yuan, K., F. Li, G. McNicol, M. Chen, A. Hoyt, S. Knox, W. J. Riley, R. Jackson, and Q. Zhu. 2024. Boreal–Arctic wetland methane emissions modulated by warming and vegetation activity. Nature Climate Change 14:282–288. https://doi.org/10.1038/s41558-024-01933-3

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### 2. Data Characteristics

Spatial Coverage: Circumpolar arctic above 44 degrees N

Spatial Resolution: 0.5-degree resolution

Temporal Resolution: Weekly

Temporal Coverage: 2002-01-01 to 2021-12-31

Site Boundaries: Latitude and longitude are given in decimal degrees.

Site	Westernmost Longitude	Easternmost Longitude	Northernmost Latitude	Southernmost Latitude
Global	-179.75	179.75	89.75	44.87

### **Data File Information**

This dataset includes one file in netCDF format: FCH4\_upscale\_BorealArctic\_weekly\_2002-2021.nc.

This netCDF holds gridded data in geographic coordinates (EPSG: 4326) at  $0.5 \times 0.5$  degree resolution. Grid cells with no data are indicated with a value of -9999.

Table 1. Variables in FCH4\_upscale\_BorealArctic\_weekly\_2002-2021.nc.

Variable	Units	Description	
FCH4_weekly_mean	nmol m <sup>-2</sup> s <sup>-1</sup>	Estimated mean methane emissions from wetlands for grid cell at a weekly time step covering 2002 to 2021 (52 weeks per year) in units of nmol CH <sub>4</sub> m <sup>-2</sup> s <sup>-1</sup>	
FCH4_weekly_std	nmol m <sup>-2</sup> s <sup>-1</sup>	Uncertainty of estimated methane emissions from wetlands for grid cell; standard deviation of mean estimate	
Boreal_Arctic_mask	1	Binary mask. Value of 1 indicates a valid land grid cell in Boreal-Arctic region	
time	d	Time measured in number of days since 2002-01-01. Value is middle day of each weekly time step.	
time_bnds	d	Beginning and ending day of each weekly time step, measured in number of days since 2002-01-01.	

# 3. Application and Derivation

This dataset is upscaled from 139 and 168 site years of eddy covariance and chamber site measurements with a causality-guide machine learning model (Yuan et al., 2024). The scientific purpose of this dataset is to provide quantitative understanding of long-term dynamics of boreal arctic wetland  $CH_4$  emissions, including emission magnitude, inter-annual variability, spatial distribution, and their dominant drivers.

## 4. Quality Assessment

The upscaling model was trained and validated with random samples of the site observations. Observations at each site were randomly assigned to one of three groups for purposes of model training (80% of observations), model validation (10%), and model testing (10%).

This training-validation-testing process was repeated with 20 independent random samples of site observations to create trained 20 upscaling models and 20 upscaled datasets of Boreal-Arctic wetland CH<sub>4</sub> emissions. The standard deviation of the 20 upscaled datasets was considered as the uncertainty and is included in this dataset.

# 5. Data Acquisition, Materials, and Methods

The inputs for the upscaling models included wetland properties, climate, and vegetation. Site observations of methane emissions measured by eddy covariance and chamber sites were used for model training and validation.

#### Wetland distribution and properties

Grid cells holding wetlands were determined using the Wetland Area and Dynamics for Methane Modeling (WAD2M) dataset for 2002 to 2021 (Zhang et al., 2021). WAD2M was derived from active and passive microwave remote sensing to prescribe wetland extent. The wetland types map from the Boreal-Arctic Wetland and Lake Dataset (BAWLD; Olefeldt et al., 2021) was used to separate wetlands into bogs, fens, marshes and wet tundra. All wetland grid cells in the BAWLD dataset that provided the wetland type information were considered for upscaling.

#### **Climate and vegetation**

Soil temperature, air temperature, air pressure, precipitation, wind speed, snow cover, soil water content, and gross primary production (GPP) were used as inputs to calculate wetland CH<sub>4</sub> emissions. GPP was obtained from the GOSIF dataset (Li and Xiao, 2019), which was derived on the basis of solar-induced chlorophyll fluorescence (SIF) observed with the Orbiting Carbon Observatory-2 and its linear relationship with GPP. Other variables were obtained from the land component of the fifth generation of European Reanalysis (ERA5-Land) datasets (Munoz-Sabater et al., 2021).

#### Site observations of wetland CH4 emissions

A comprehensive dataset of CH  $_4$  emissions that broadly covered the Boreal–Arctic region was compiled by combining the FLUXNET-CH4 dataset (Knox et al., 2019), BAWLD-CH4 dataset (Kuhn et al., 2021), and the chamber dataset in Bao et al. (2021). All chamber sites that explicitly included the wetland types considered in this work were selected. Quality-assured observed wetland CH4 emissions at eddy covariance sites were used instead of gap-filled data. In total, this study included 139 and 168 site years of eddy covariance and chamber site measurements, respectively.

Additional details are available in Yuan et al. (2024).

### 6. Data Access

These data are available through the Oak Ridge National Laboratory (ORNL) Distributed Active Archive Center (DAAC).

Boreal Arctic Wetland Methane Emissions, 2002-2021

Contact for Data Center Access Information:

- E-mail: uso@daac.ornl.gov
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### 7. References

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