Supplement of "Methane fluxes from arctic & boreal North America: Comparisons between process-based estimates and atmospheric observations"

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Details on the in situ tower sites

Tower Site	ID	Lat	Long	Elevation (masl)	Intake Height (magl)
Abbotsford	ABT	49.0°N	122.3°W	60	33
Bratt's Lake	BRA	50.2°N	104.7°W	595	35
Barrow Atmospheric Baseline Observatory	BRW	71.3°N	156.6°W	11	16
Behchoko	BCK	62.8°N	115.9°W	160	60
Cambridge Bay	CBY	69.1°N	105.1°W	35	12
Churchill	CHL	58.7°N	93.8°W	29	60
CARVE	CRV	65.0°N	147.6°W	611	32
Chapais	CPS	49.8°N	75.0°W	391	40
Egbert	EGB	44.2°N	79.8°W	251	25
Estevan Point	ESP	49.4°N	126.5°W	7	40
Esther	EST	51.7°N	110.2°W	707	50
East Trout Lake	ETL	54.4°N	104.9°W	493	105
Fort Nelson	FNE	58.8°N	122.6°W	361	15
Fraserdale	FSD	49.9°N	81.6°W	210	40
Hanlan's Point	HNP	43.6°N	79.4°W	87	10
Inuvik	INU	68.3°N	133.5°W	113	10
Park Falls	LEF	45.9°N	90.3°W	472	396
Lac La Biche	LLB	55.0°N	112.5°W	540	50
Toronto Atmospheric Observatory	TAO	43.7°N	79.4°W	100	174
Turkey Point	TPD	42.6°N	80.6°W	231	35
Sable Island	WSA	43.9°N	60.0°W	5	25

Table S1. Summary of 21 in-situ tall tower sites across Canada and the US, detailing their names, site codes, longitudes, latitudes, elevation (Surface elevation in meters above sea level), and intake height (Sample intake height in meters above ground level (magl)). Note that the abbreviation "CARVE" is short for 'Carbon in Arctic Reservoirs Vulnerability Experiment.'

Details on the GCP models

Model	Spatial Resolution (Rows × Columns)	References
$CH_4MOD_{wetland}$	360 x 720	Li et al., 2010
CLASSIC	53 x 128	Arora et al., 2018
DLEM	360 x 720	Tian et al., 2010
ELM-ECA	360 x 720	Zhu et al., 2019
ISAM	360 x 720	Shu et al., 2020
JSBACH	96 x 192	Kleinen et al., 2020
JULES	360 x 720	Clark et al., 2011
LPJ-GUESS	360 x 720	McGuire et al., 2012; Wania et al., 2010
LPJ-MPI	360 x 720	Kleinen et al., 2012
LPJ-wsl	360 x 720	Zhang et al., 2016
LPX-Bern	360 x 720	Spahni et al., 2011
ORCHIDEE	180 x 360	Ringeval et al., 2010
SDGVM	360 x 720	Singarayer et al., 2011
TEM-MDM	360 x 720	Liu et al., 2020
TRIPLEX-GHG	582 x 1440	Zhu et al., 2014
VISIT	360 x 720	Ito and Inatomi, 2012

Table S2. The 16 GCP global wetland flux models that we use in the study, including the number of global latitude and longitude grid cells in each model.

Details on the wetland to anthropogenic ratios at each in-situ tower site

Tower Site ID	Biome Type	Wetland to Anthropogenic Ratios
ABT	Temperate Forests	1.06
BRA	Temperate Grasslands	0.26
BRW	Tundra	0.85
BCK	**Boreal Forests/Taiga**	**8.79**
CBY	**Tundra**	**7.56**
CHL	**Boreal Forests/Taiga**	**14.00**
CRV	**Tundra**	**5.09**
CPS	**Boreal Forests/Taiga**	**2.51**
EGB	Temperate Forests	0.52
ESP	**Temperate Forests**	**3.57**
EST	Temperate Grasslands	0.34
ETL	**Boreal Forests/Taiga**	**1.31**
FNE	**Boreal Forests/Taiga**	**1.43**
FSD	**Boreal Forests/Taiga**	**3.93**
HNP	Temperate Forests	0.18
INU	**Boreal Forests/Taiga**	**9.17**
LEF	Temperate Forests	0.78
LLB	Temperate Grasslands	0.62
TAO	Temperate Forests	0.21
TPD	Temperate Forests	0.31
WSA	Temperate Forests	1.07

Table S3. The 21 in-situ tall tower sites with biome types and wetland to anthropogenic ratios. The ratios represent averages computed from prognostic and diagnostic model outputs, calculated as the modeled CAMS-derived CH_4 mixing ratios divided by the modeled mixing rations using the GCP models. In this study, we define sites with ratios greater than 1.5 as wetland-dominated; however, we also include ETL and FNE because their ratios (1.31 and 1.43) are close to this 1.5 threshold. The sites in bold are the wetland-dominated sites used in our analysis, and we exclude other sites because they are more influenced by anthropogenic emissions.

Detailed Groupings of Prognostic GCP Models Based on Their R^2 Values

GCP Wetland Models	R^2 Values	Group
VISIT	0.5	High
CLASSIC	0.47	High
LPJ-wsl	0.46	High
LPJ-MPI	0.42	High
SDGVM	0.41	High
JSBACH	0.35	Average
LPX-Bern	0.34	Average
ORCHIDEE	0.32	Average
JULES	0.22	Low
ISAM	0.22	Low
ELM	0.21	Low

Table S4. Detailed groupings of Prognostic GCP models based on their R^2 values. The table presents each GCP wetland model alongside its R^2 value and assigned group (High, Average, or Low) as determined by the performance criteria (High $>$ 0.4; Average $>$ 0.3; Low $>$ 0.2).

Detailed Groupings of Diagnostic GCP Models Based on Their R^2 Values

GCP Wetland Models	R^2 Values	Group
LPJ-wsl	0.53	High
VISIT	0.5	High
LPJ-MPI	0.43	High
ISAM	0.42	High
CLASSIC	0.40	Average
JSBACH	0.39	Average
JULES	0.39	Average
SDGVM	0.37	Average
ORCHIDEE	0.34	Average
LPX-Bern	0.27	Low
ELM	0.22	Low

Table S5. Detailed groupings of Diagnostic GCP models based on their R^2 values. The table presents each GCP wetland model alongside its R^2 value and assigned group (High, Average, or Low) as determined by the performance criteria (High $>$ 0.4; Average $>$ 0.3; Low $>$ 0.2).

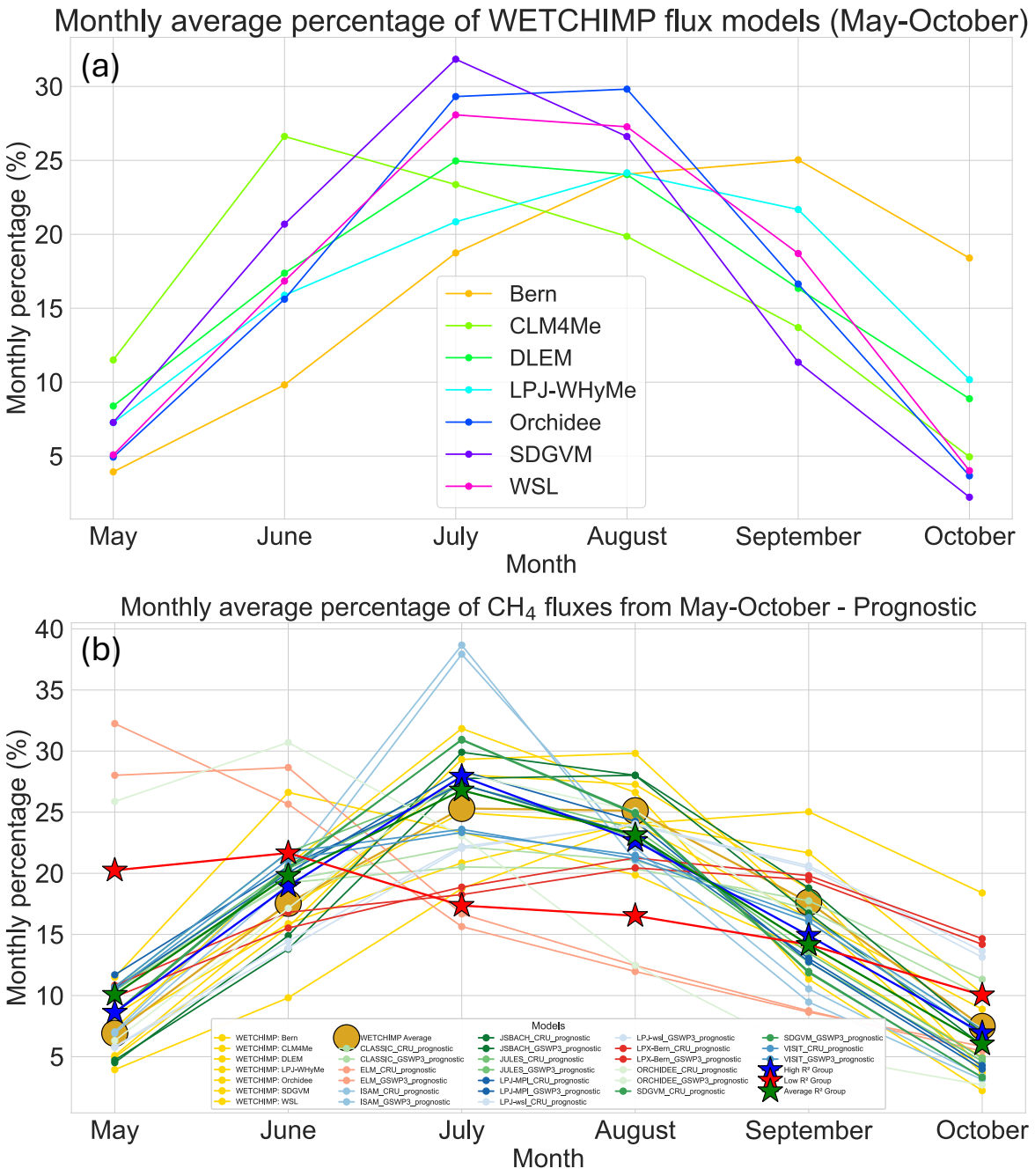


Figure S1. The seasonal cycles of the WETCHIMP models (a) and a comparison with the GCP models (b). In panel a, each colored line represents the percentage of fluxes that occurred in a specific model in that month compared to the total fluxes from that model for the months of May through October. Panel b displays the same quantity but also includes the GCP models. Each model is color-coded blue, green, or red lines to represent the GCP models that have the highest, average, and low R^2 values, respectively, in the comparisons with atmospheric CH_4 observations. The yellow lines in this panel represent the WETCHIMP models.

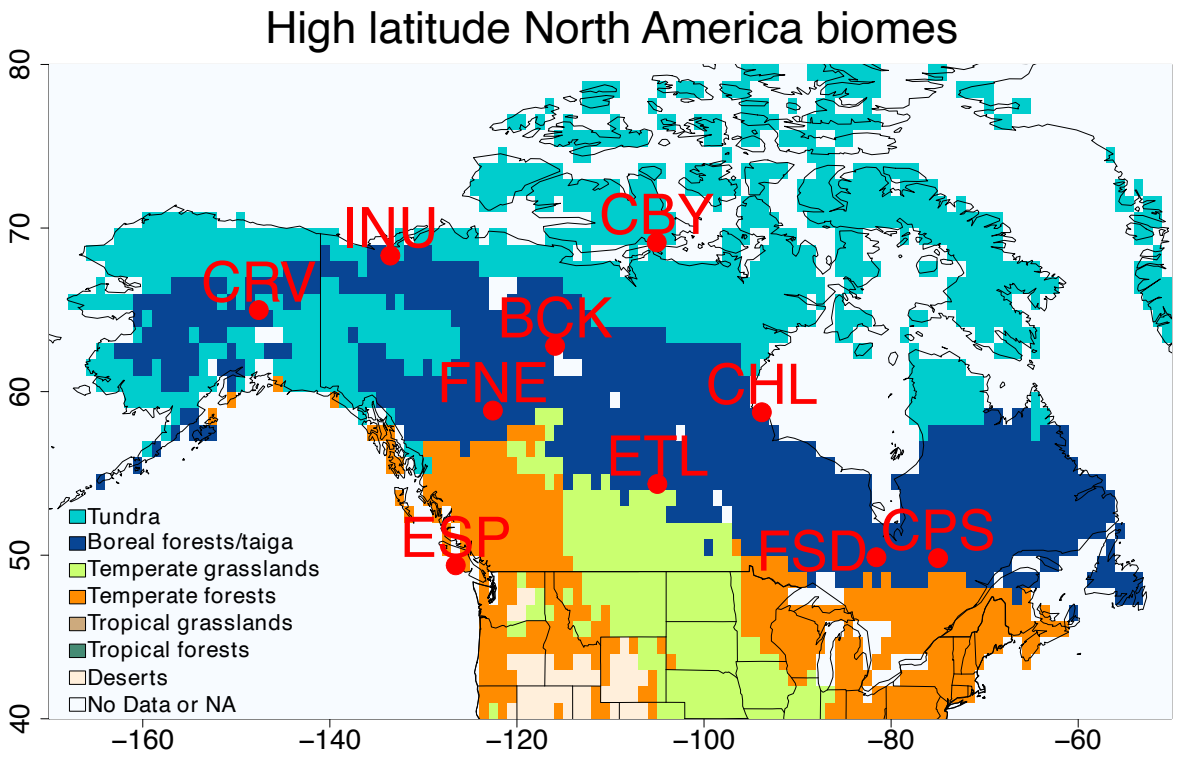
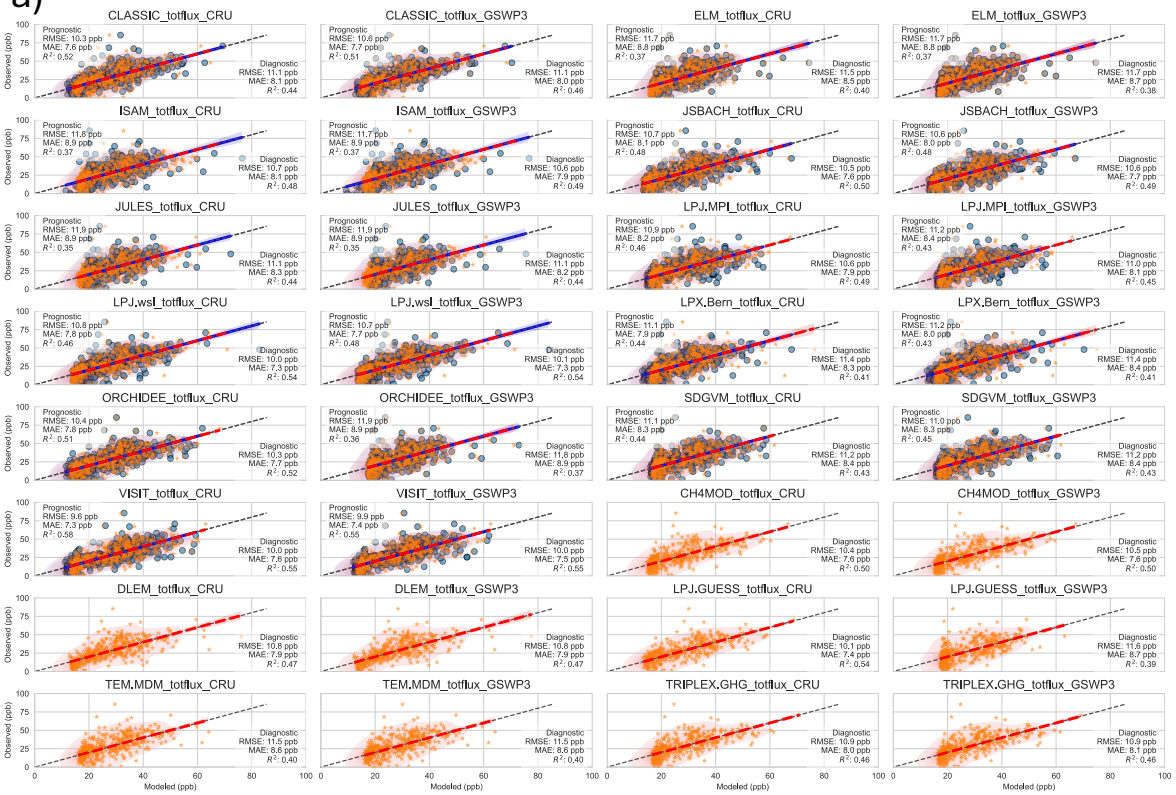


Figure S2. Biome map of high-latitude North America highlighting the three out of seven biome types examined in this study: Tundra and Boreal Forests/Taiga, and Temperate Forests. Red dots indicate wetland-dominated measurement sites, comprising a total of ten locations—nine across Canada and one in Alaska. Six sites (FNE, BCK, CHL, ETL, FSD, CPS) are located within the Boreal Forests/Taiga biome, three sites (CRV, INU, CBY) are within the Tundra biome, and one site (ESP) is located in the Temperate Forests biome. The biome map comes from the "Terrestrial Ecoregions of the World" product created by World Wildlife Fund (Olson et al., 2001).

Correlation Coefficients

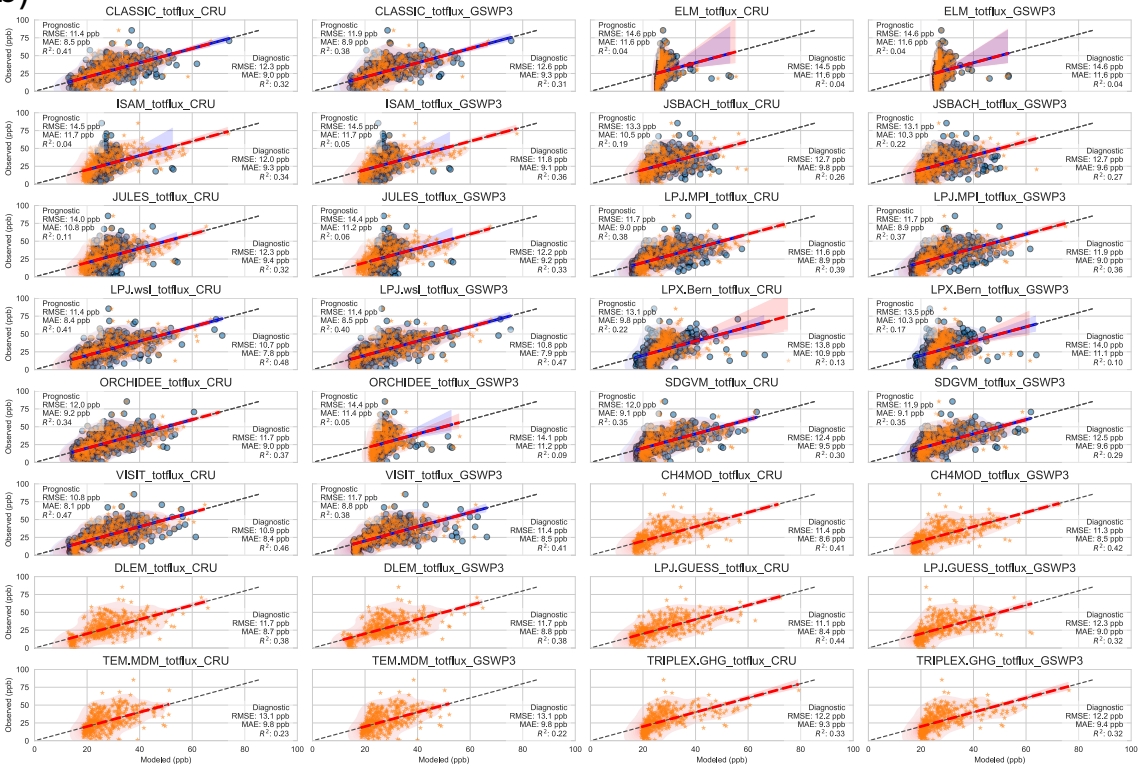
CH_4 comparison at wetland-dominated sites: observed vs modeled (GCP) using CAMS

a)



CH_4 comparison at wetland-dominated sites: observed vs modeled (GCP) using CarbonTracker

b)



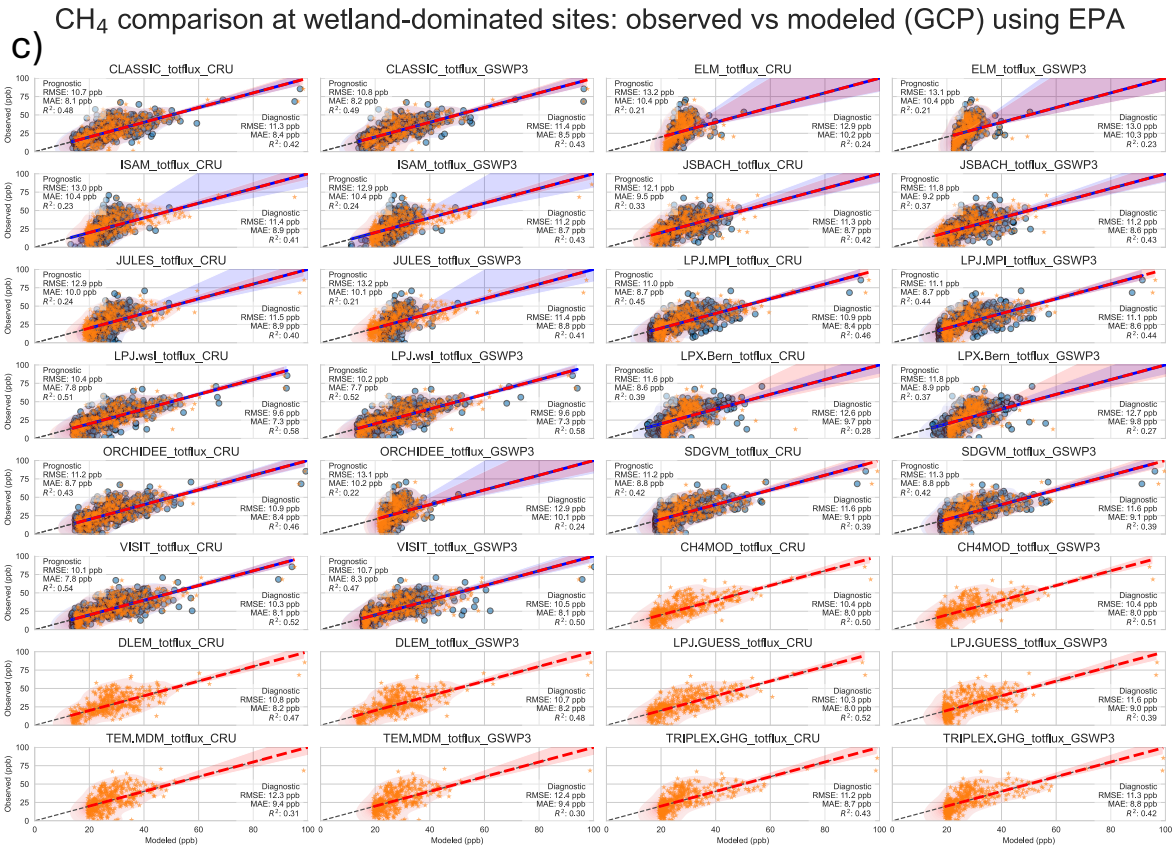


Figure S3. The correlation coefficients and R^2 values between the observed CH_4 increments and the predicted values derived from the GCP models using a multiple linear regression approach. The regression results are shown in panel (a) using CAMS as the anthropogenic flux product. In panel (b), we use the CarbonTracker anthropogenic flux product. And in panel (c), we use the combination of the gridded U.S. EPA CH_4 inventory and Scarpelli's anthropogenic CH_4 flux products covering the regions of Canada and Alaska (Maasakkers et al., 2023; Scarpelli et al., 2021). The blue dots represent the regression results using the prognostic GCP models, and the orange dots represent the regression results using the diagnostic models. The black line in each panel is a 1:1 line, and the colored lines show estimated regression lines. The shaded colors represent the 95% confidence intervals of the regression lines.

Comparisons between GCP models and atmospheric observations by biomes

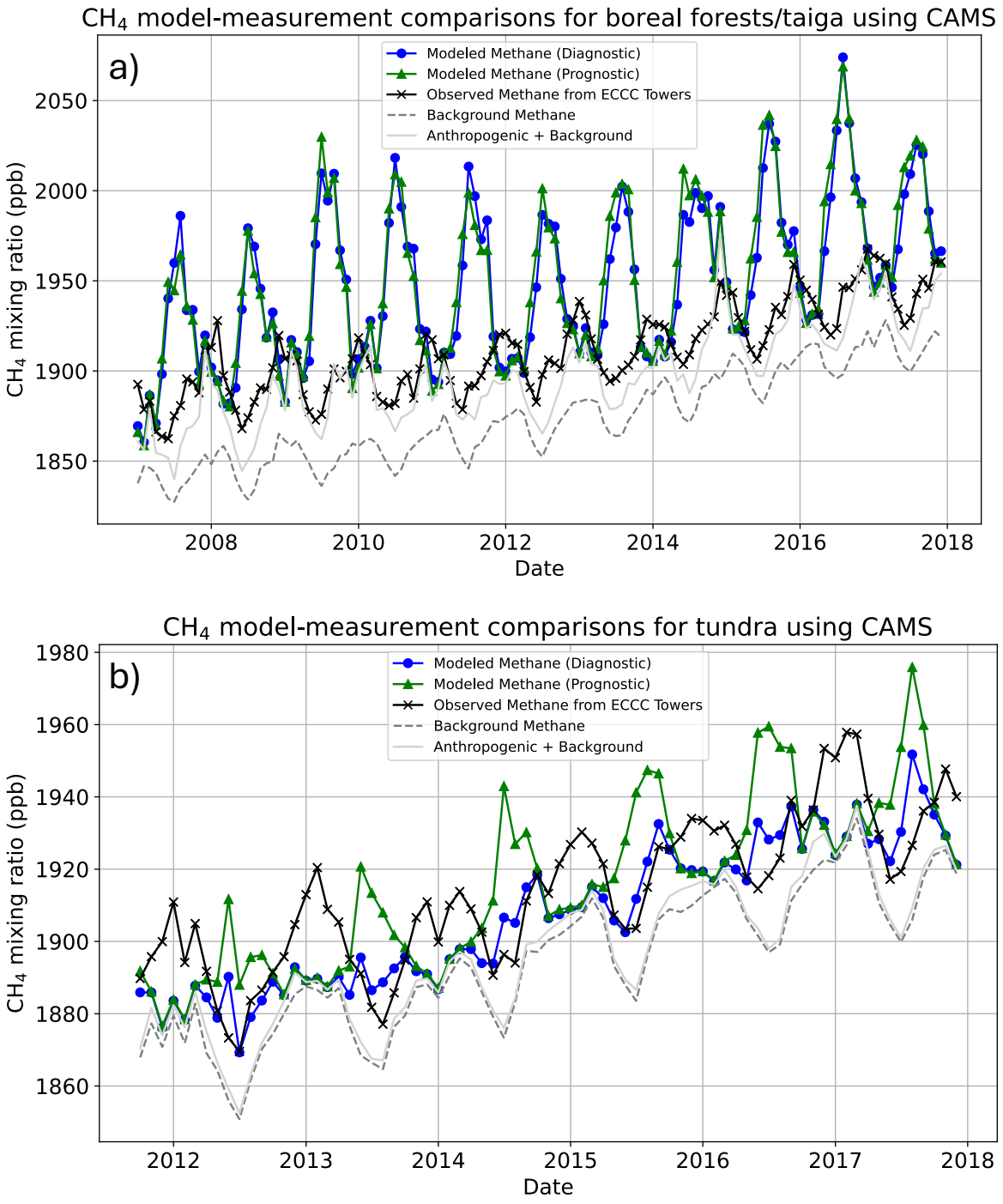


Figure S4. A time series of the mean modeled CH_4 mixing ratios using the STILT model with anthropogenic fluxes from CAMS and wetland fluxes set at the mean of the GCP ensemble across different biomes at ten wetland dominated sites between 2007 and 2017. The two panels correspond to: a) Boreal Forests and Taiga and b) Tundra. The dashed gray line represents the boundary conditions, while the solid gray line shows the sum of the boundary conditions and modeled anthropogenic mixing ratios using CAMS. The green line indicates the total modeled mixing ratios from prognostic models, and the blue line represents those from diagnostic models.

Annual CH_4 flux total using the WETCHIMP models

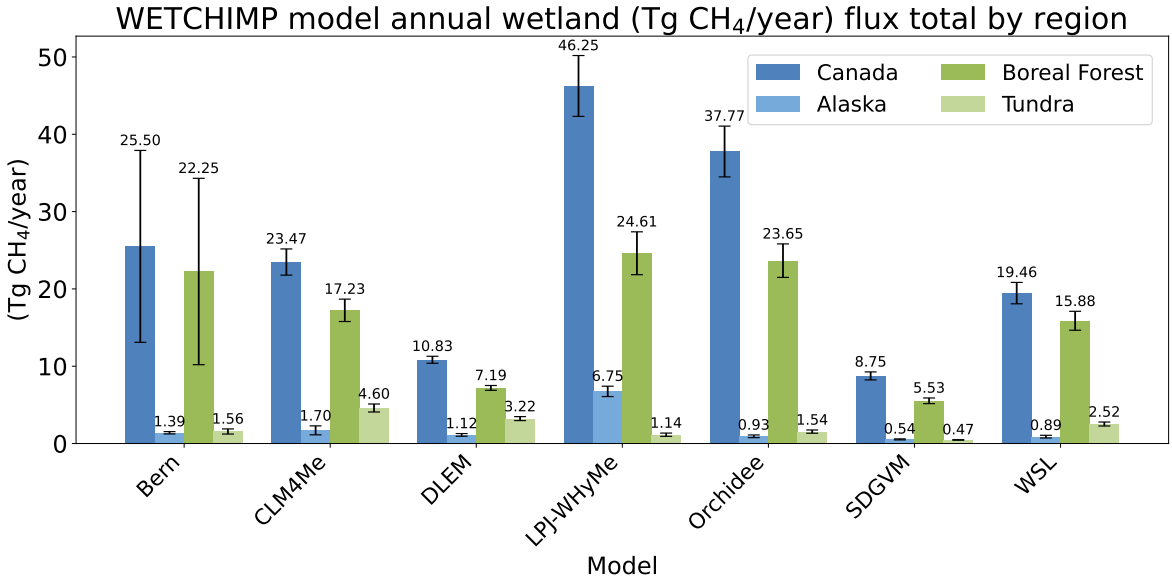


Figure S5. Averaged annual CH_4 flux totals by region and biome type using the WETCHIMP models, averaged across years 1993-2004. There are seven total models included (shown on the x-axis), and the y-axis represents the total annual fluxes in Tg CH_4 per year. The uncertainty bars represent the standard deviations of the annual CH_4 flux totals across different years.

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