



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



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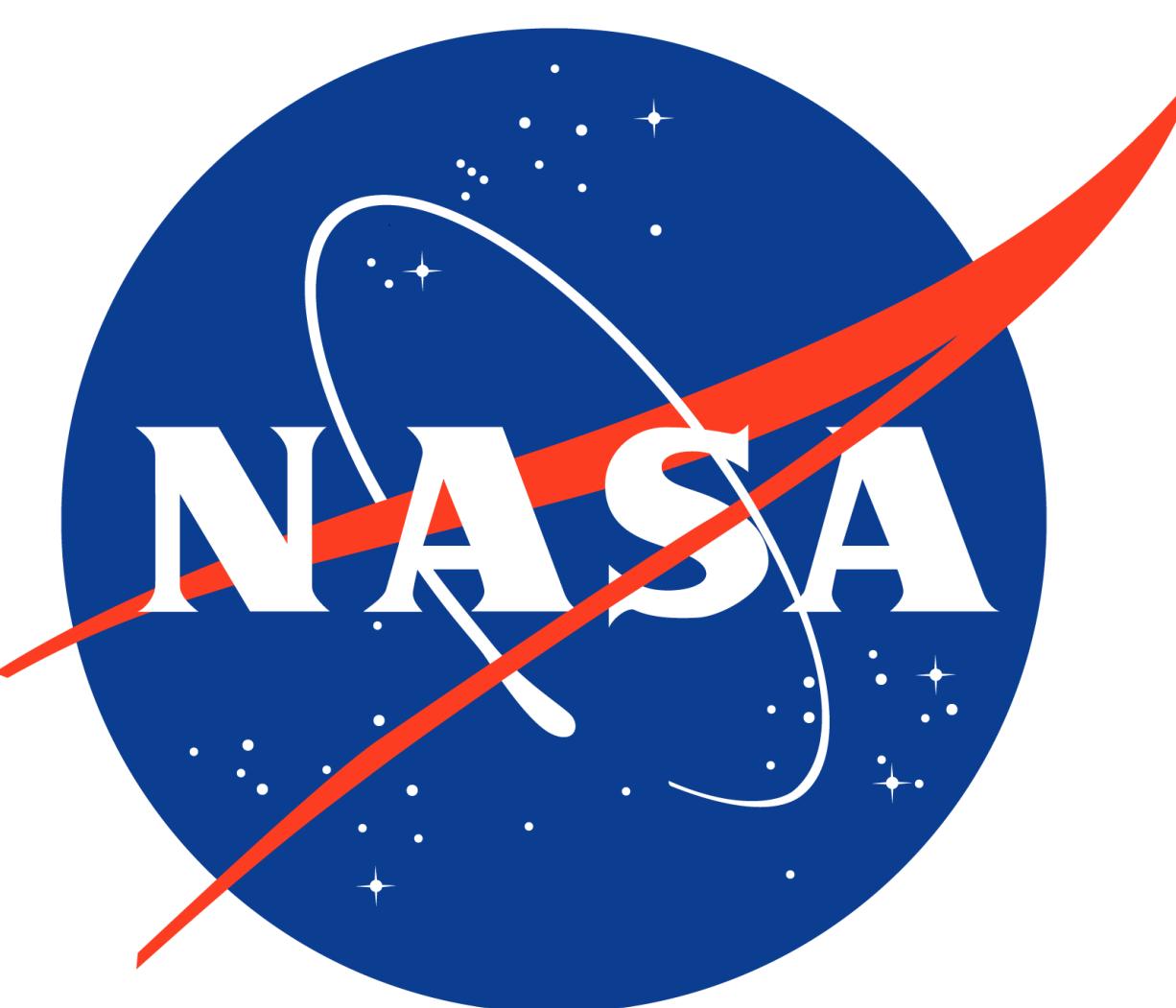
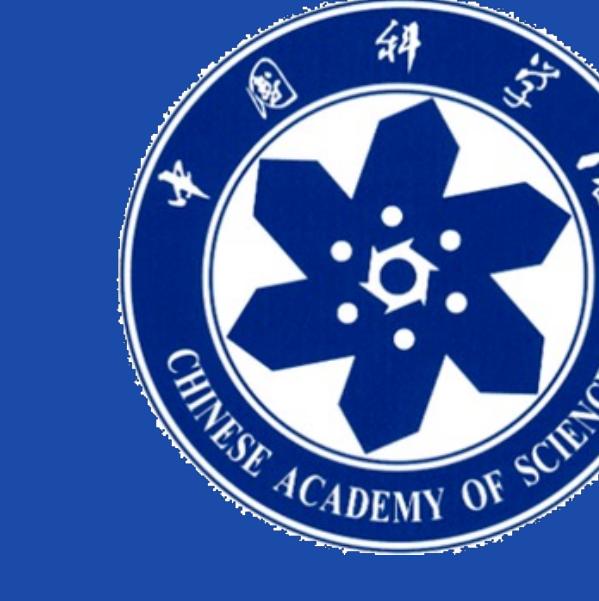
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## INTRODUCTION

- Rising temperatures and permafrost thaw create more opportunities for methanogens to produce methane under anaerobic conditions, contributing to a positive climate feedback in Arctic-boreal regions.
- Existing process-based models can lead to uncertainties in the magnitude, seasonality, and spatial distribution of  $\text{CH}_4$  fluxes across high-latitude America.

## RESEARCH QUESTIONS

- Model Evolution:** How have process-based  $\text{CH}_4$  flux models progressed over time?
- Model–Observation Comparison:** How well do global-scale process-based models capture the magnitude of  $\text{CH}_4$  fluxes compared to atmospheric observations in high-latitude North America?
- Spatial–Temporal Patterns:** What spatial-temporal patterns are commonly observed in models that closely align with atmospheric measurements?

## GLOBAL CARBON PROJECT MODEL

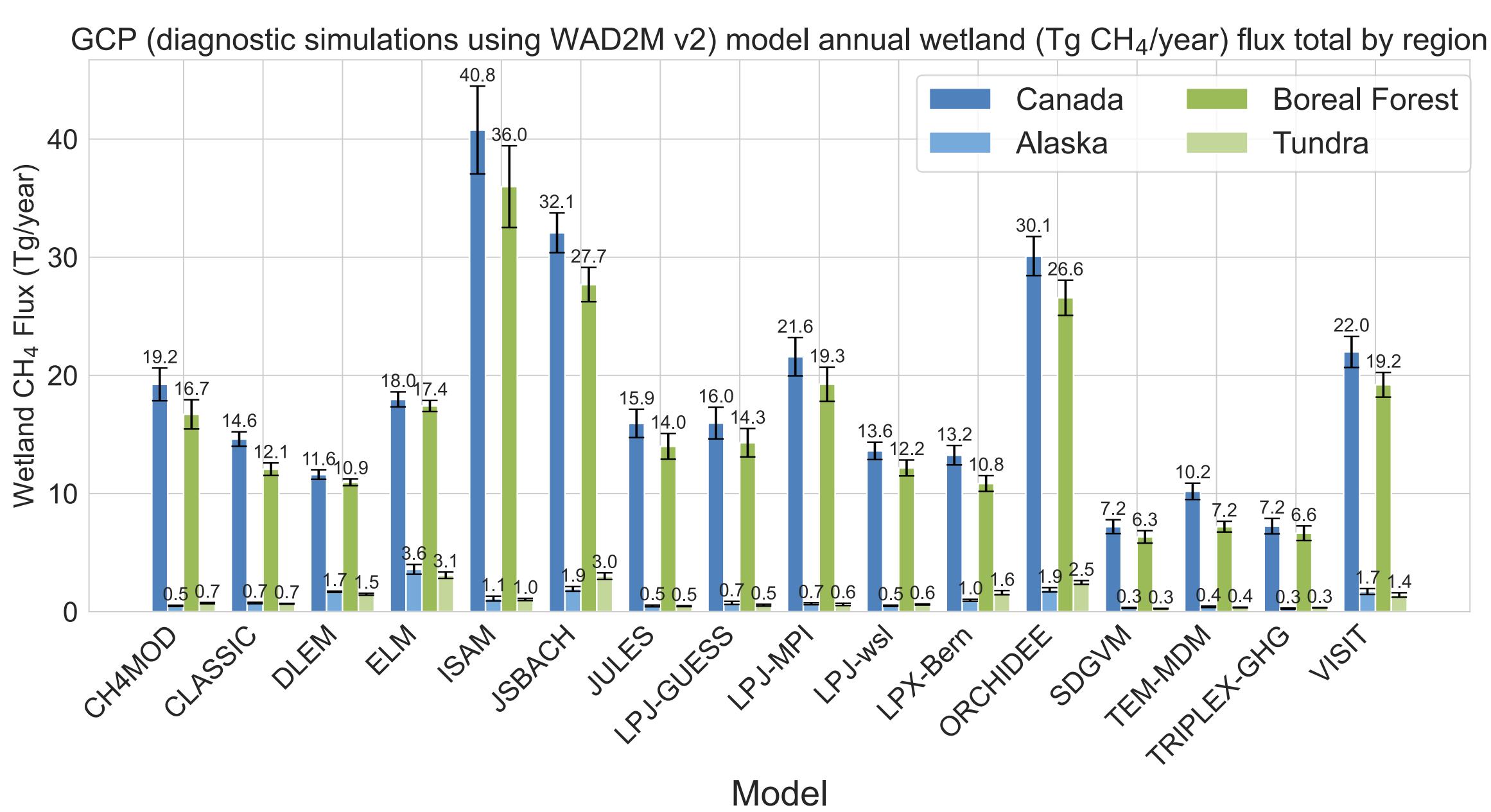


Figure 1. The 16 Global Carbon Project (GCP) global  $\text{CH}_4$  wetland flux models that we use in the study.

## STILT FOOTPRINTS

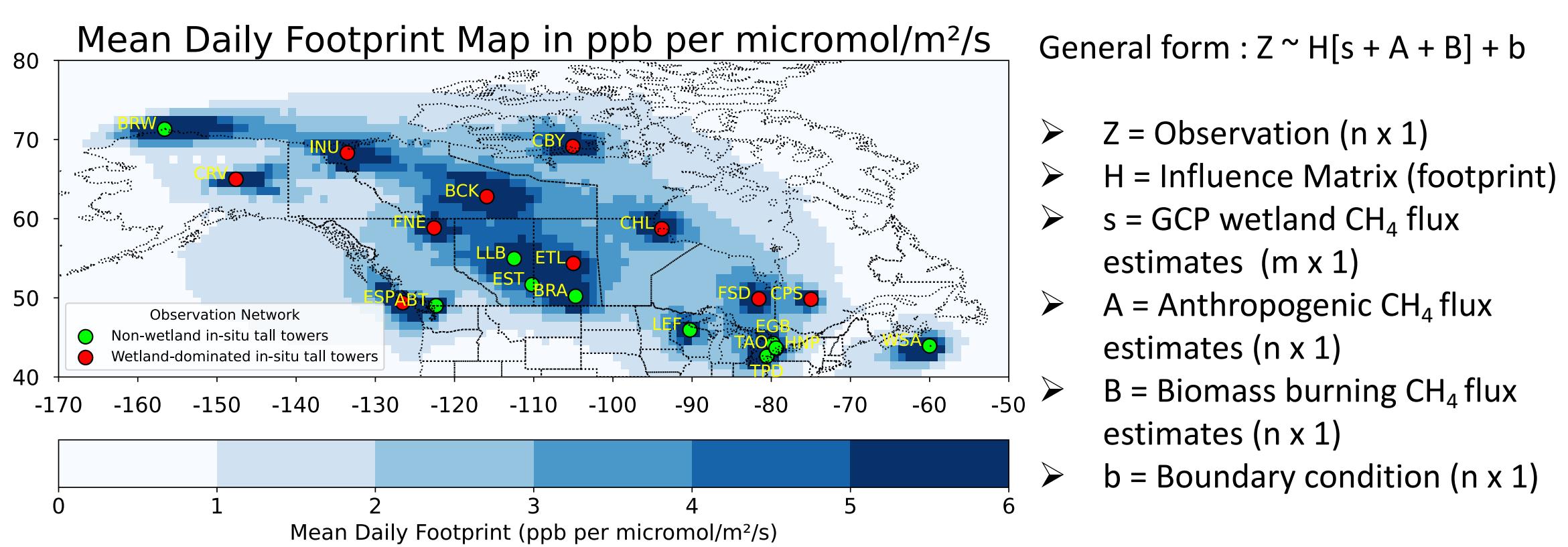


Figure 2. The US and Canadian atmospheric  $\text{CH}_4$  observing network from 2007-2017. The figure also shows the WRF-STILT mean daily footprint map in  $\text{ppb } \mu\text{mol/m}^2/\text{s}$  across the study domain of  $40^\circ\text{N}$  to  $80^\circ\text{N}$  and  $170^\circ\text{W}$  to  $50^\circ\text{W}$ . The lime-colored dots represent non-wetland sites, where the wetland-to-anthropogenic  $\text{CH}_4$  concentration ratio is less than 1.5 (using anthropogenic emissions from the CAMS product). In contrast, the red-colored dots indicate wetland-dominated sites, where this ratio exceeds 1.5.

## ATMOSPHERIC OBSERVATIONS FROM IN SITU TOWERS

- This study compares  $\text{CH}_4$  flux models over a decade (2007-2017) using in-situ tower observations from Environmental Canada and NOAA in high-latitude north America regions.

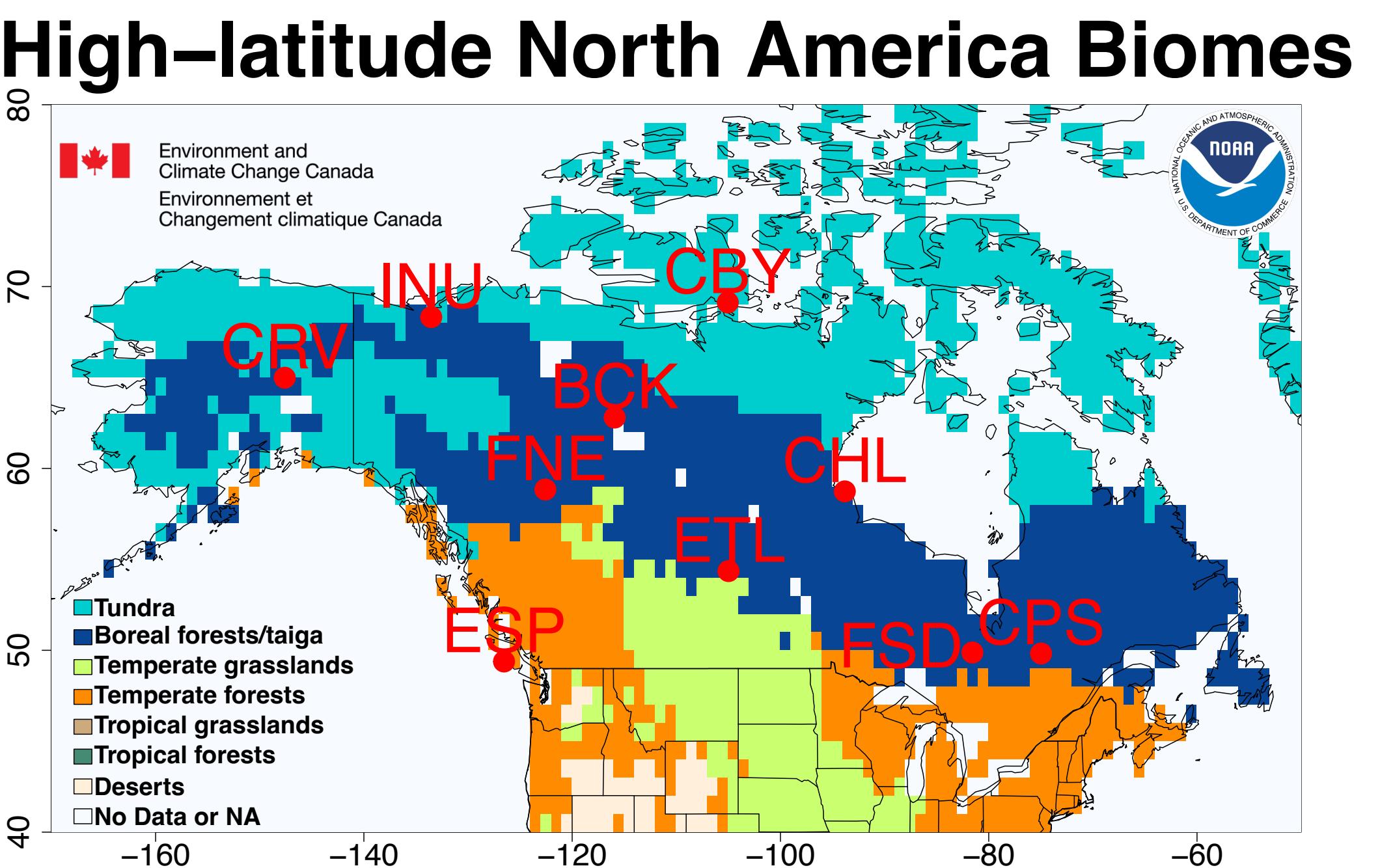


Figure 3. Biome map of high-latitude North America highlighting the four out of seven biome types examined in this study.

## COMPARISONS WITH THE WETCHIMP MODELS

Spatial distribution of  $\text{CH}_4$  fluxes standard deviation from May–October

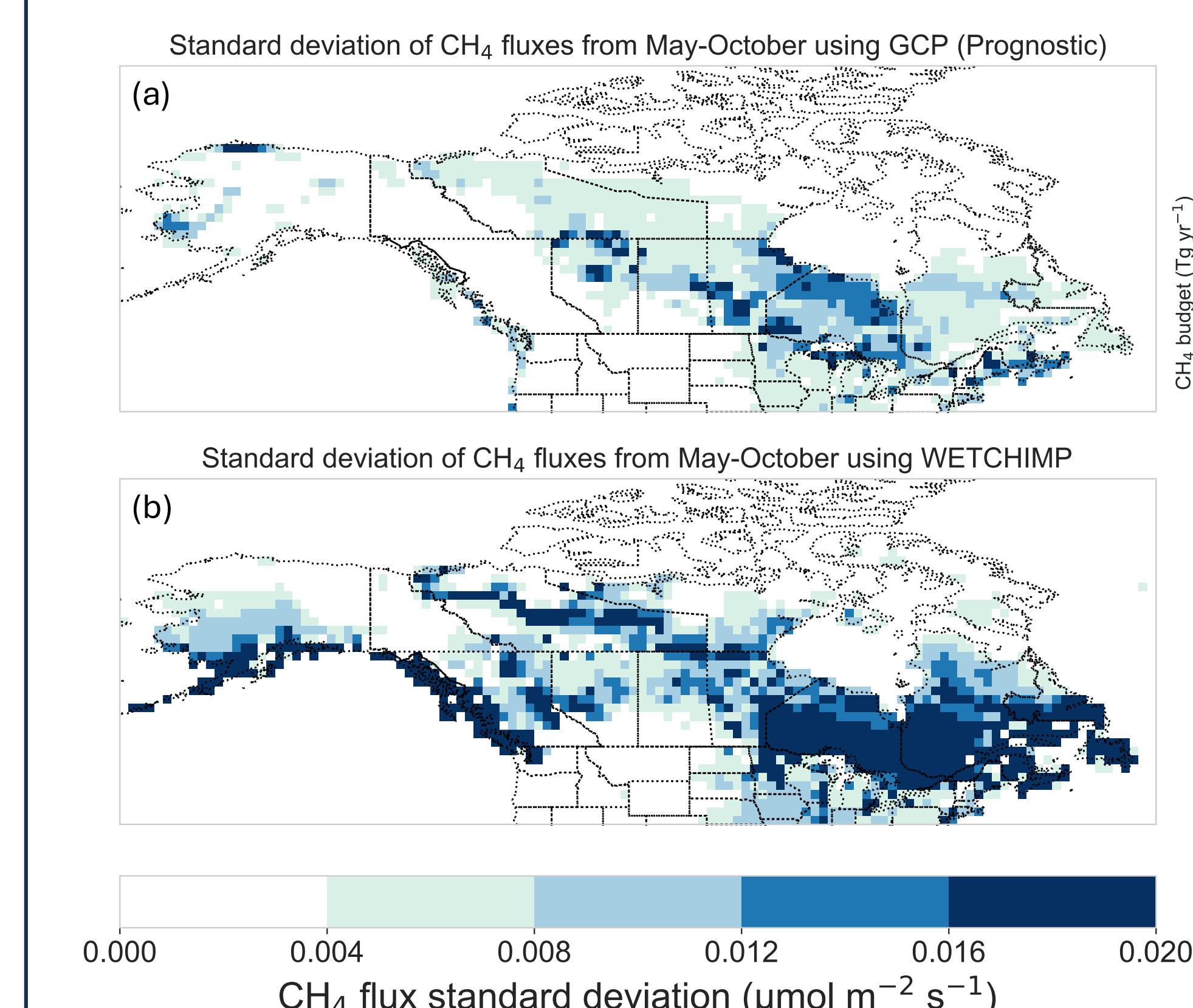


Figure 4. The inter-model standard deviation for each individual model grid box, calculated using the 11 prognostic GCP models (top) and WETCHIMP models (bottom). The inter-model uncertainty in model locations is higher for the WETCHIMP models than the GCP models. All fluxes have units  $\mu\text{mol m}^{-2} \text{s}^{-1}$ .

Comparison of  $\text{CH}_4$  budgets by region/biome using GCP vs WETCHIMP

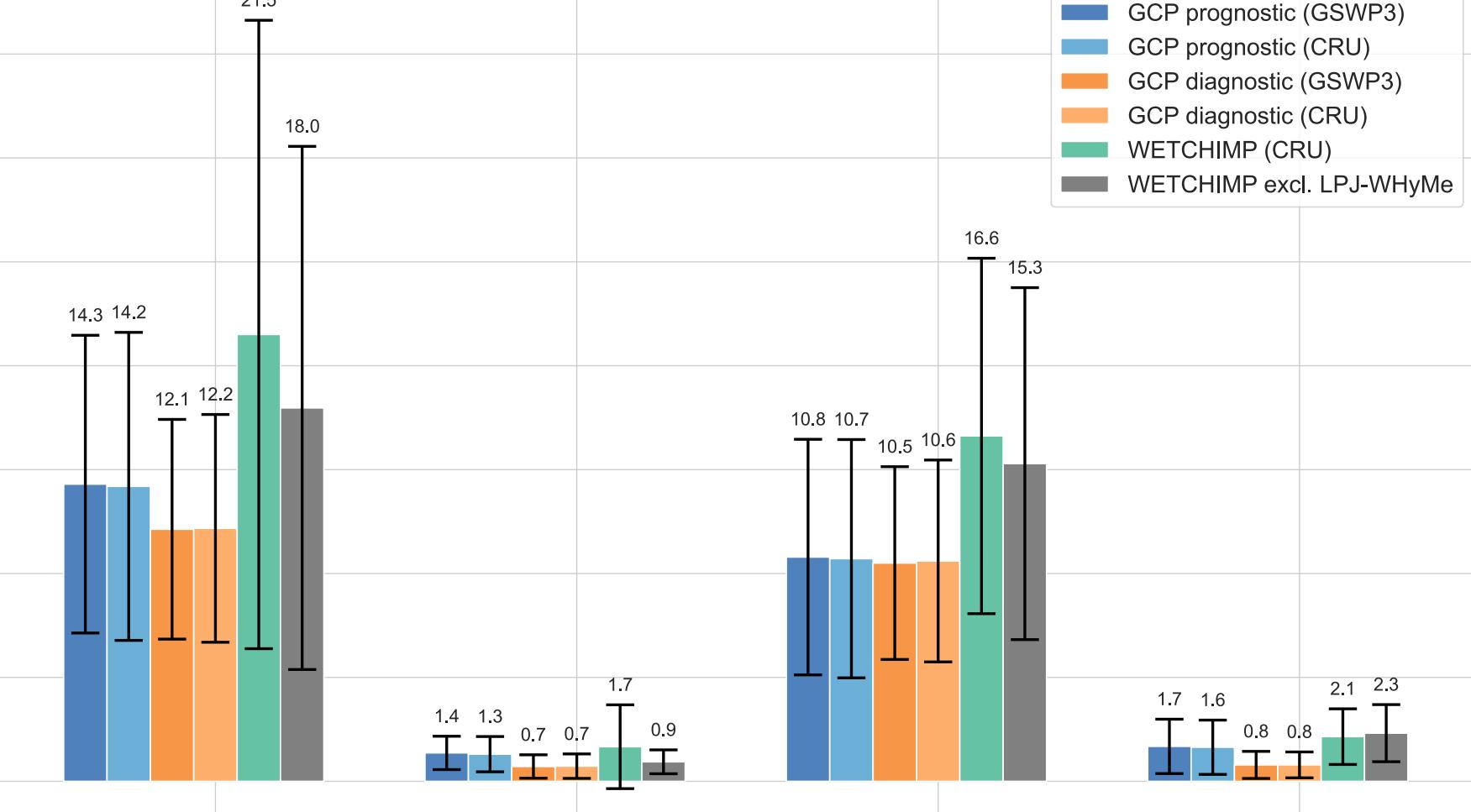


Figure 5. Annual  $\text{CH}_4$  flux totals across Canada, Alaska, and several biomes. The four bars on the left of each region or biome represent the 2 different climate forcing data (GSWP3 and CRU) and prognostic versus diagnostic types for the GCP models. The green bar shows the mean annual  $\text{CH}_4$  flux total using all WETCHIMP models, and the gray bar denotes the mean flux total excluding the ORCHIDEE model.

- $\text{CH}_4$  flux estimates from the GCP models are a factor of  $\sim 1.5$  smaller across most of high-latitude North America compared to the WETCHIMP models.
- $\text{CH}_4$  fluxes estimated by the prognostic GCP models result in much lower inter-model uncertainty compared to the seven WETCHIMP models, with smaller inter-model disagreement across Canada and southern Alaska.

## COMPARISONS WITH ATMOSPHERIC DATA

Magnitude comparison of prognostic and diagnostic GCP models using wetland-dominated sites (May–October)

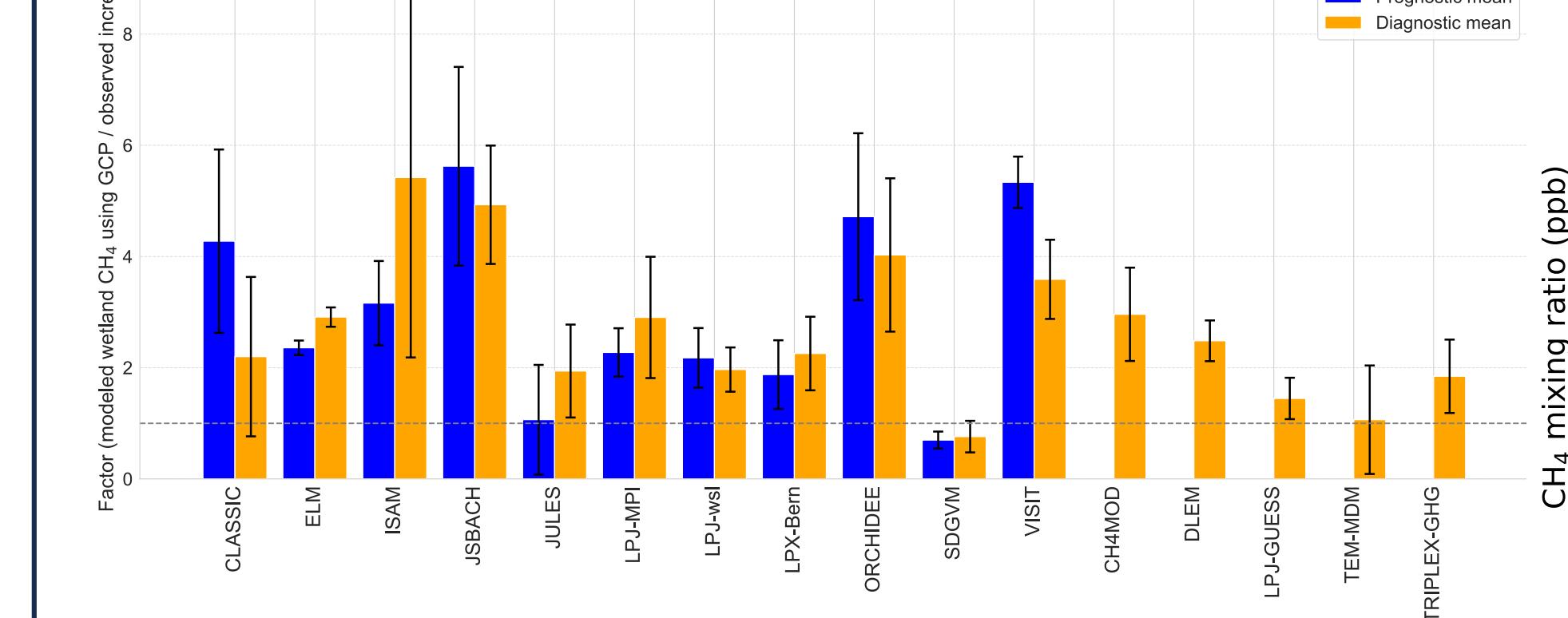


Figure 6. Comparisons between modeled mixing ratios from STILT against observations at the tower sites. The y-axis has values from 0 to 9, representing the ratio between the modeled wetland  $\text{CH}_4$  mixing ratios using the GCP models and the observed increment. We define the observed increment as the difference between atmospheric  $\text{CH}_4$  observations and the sum of the boundary  $\text{CH}_4$  levels, modeled anthropogenic  $\text{CH}_4$  mixing ratios, and modeled biomass burning  $\text{CH}_4$  mixing ratios.

CH4 model-measurement comparisons for boreal forests/taiga using CAMS

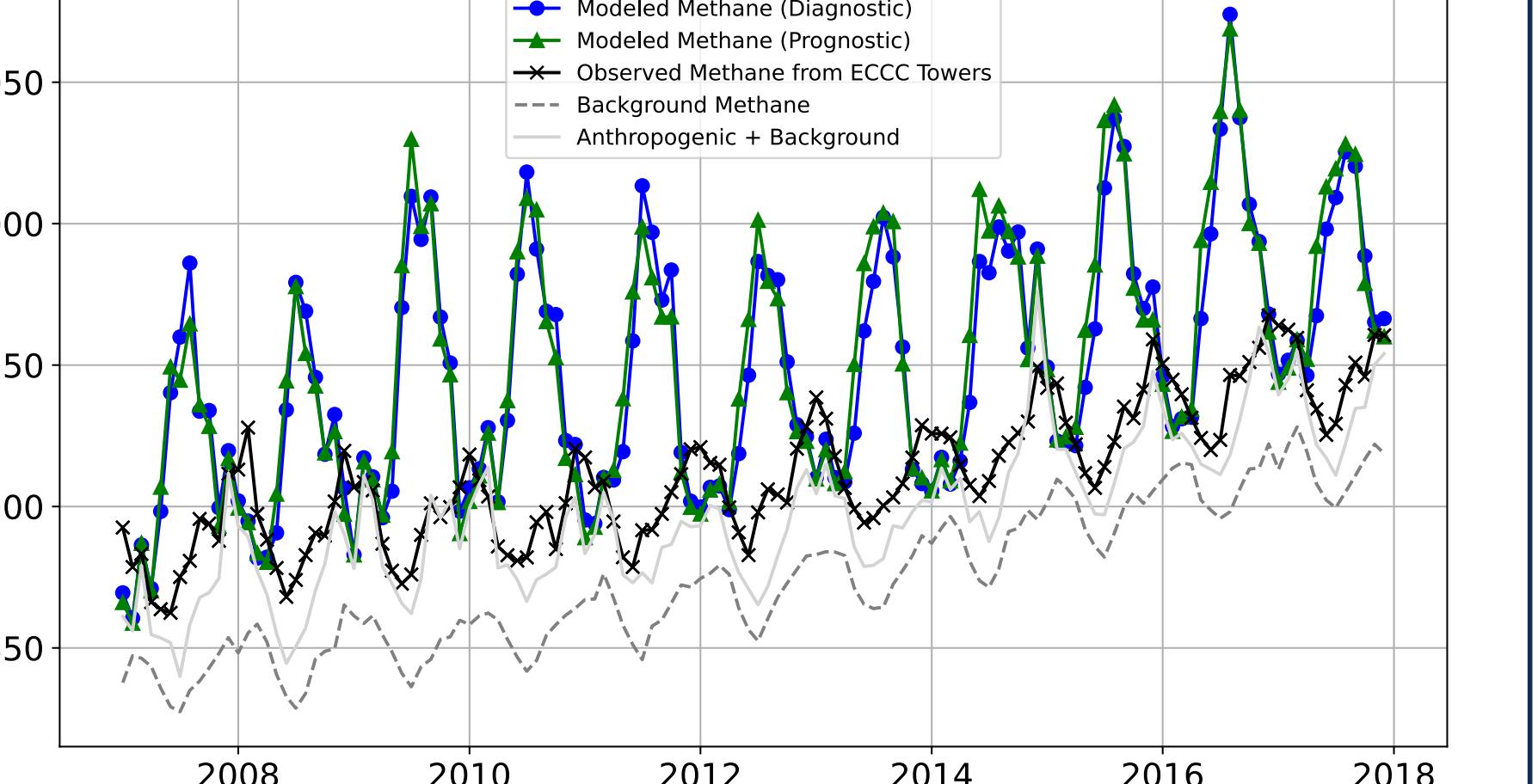


Figure 7. A time series of the mean modeled  $\text{CH}_4$  mixing ratios using the STILT model with anthropogenic fluxes from CAMS and wetland fluxes set at the mean of the GCP ensemble across boreal forests/taiga using ten wetland dominated sites between 2007 and 2017.

## COMPARISONS WITH ATMOSPHERIC DATA

Mean  $R^2$  Values for 16 GCP Wetland Models at Wetland-dominated Sites (Prognostic vs Diagnostic)

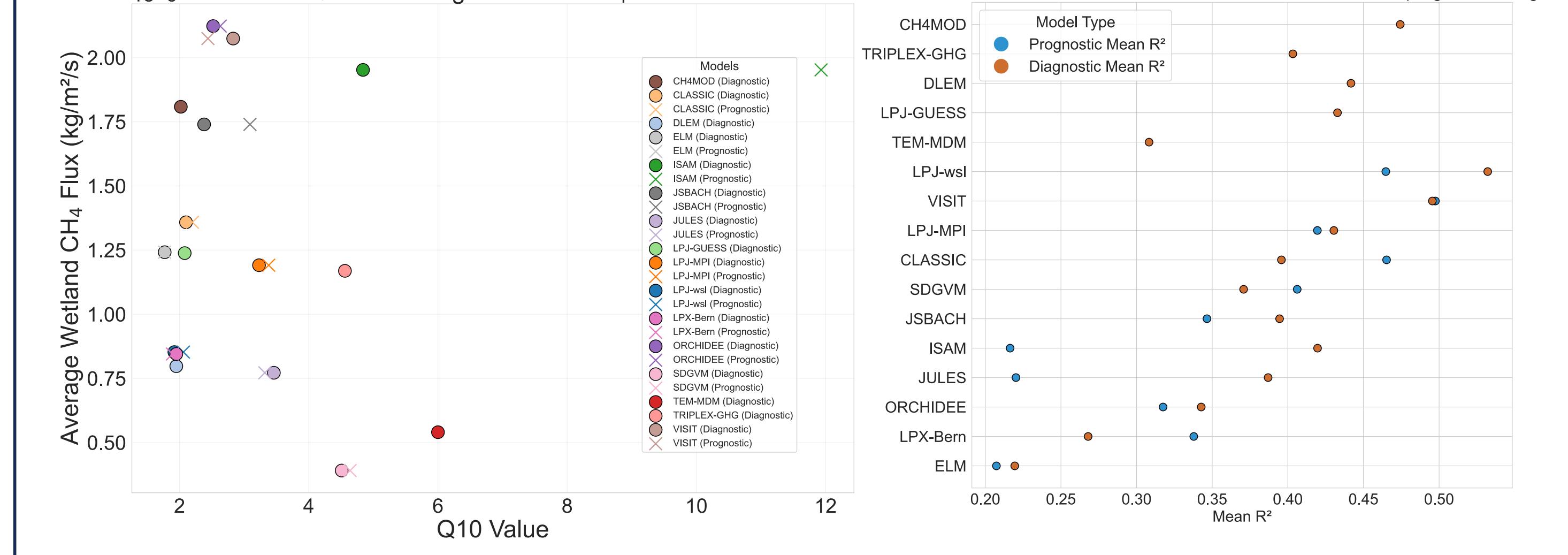


Figure 8.  $Q_{10}$  factors estimated for each of the GCP models. The plot also shows the relationship between the magnitude of fluxes estimated by each model for the study domain and the  $Q_{10}$  value estimated for each model.

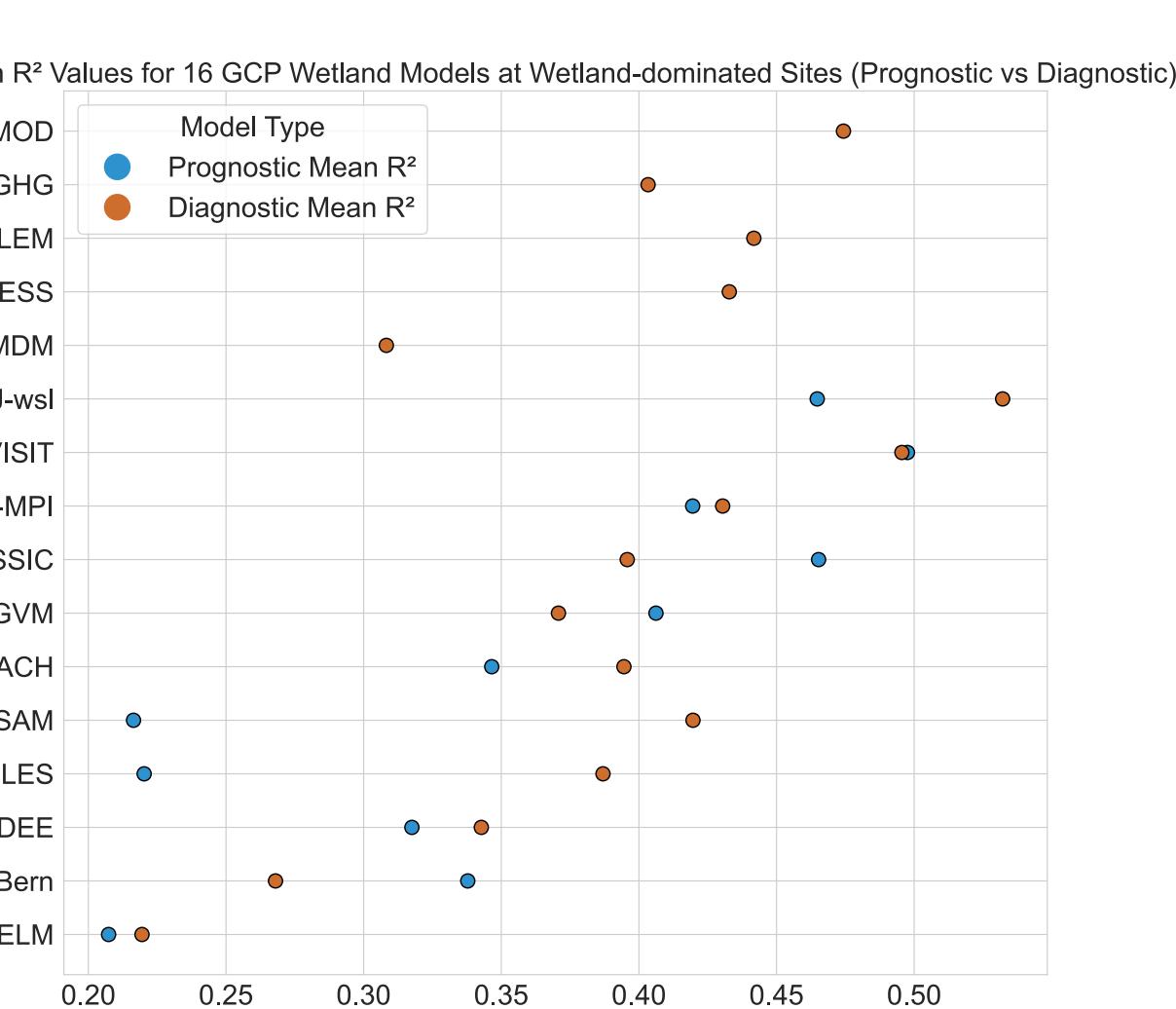


Figure 9. The correlation  $R^2$  between modeled  $\text{CH}_4$  mixing ratios using the GCP models and atmospheric observations. The y-axis lists all the prognostic and diagnostic GCP models, and x-axis shows the  $R^2$  range for these GCP models.

## SHARED SPATIAL-TEMPORAL PATTERNS

Monthly Average Percentage of GCP  $\text{CH}_4$  Fluxes from May to October – Diagnostic

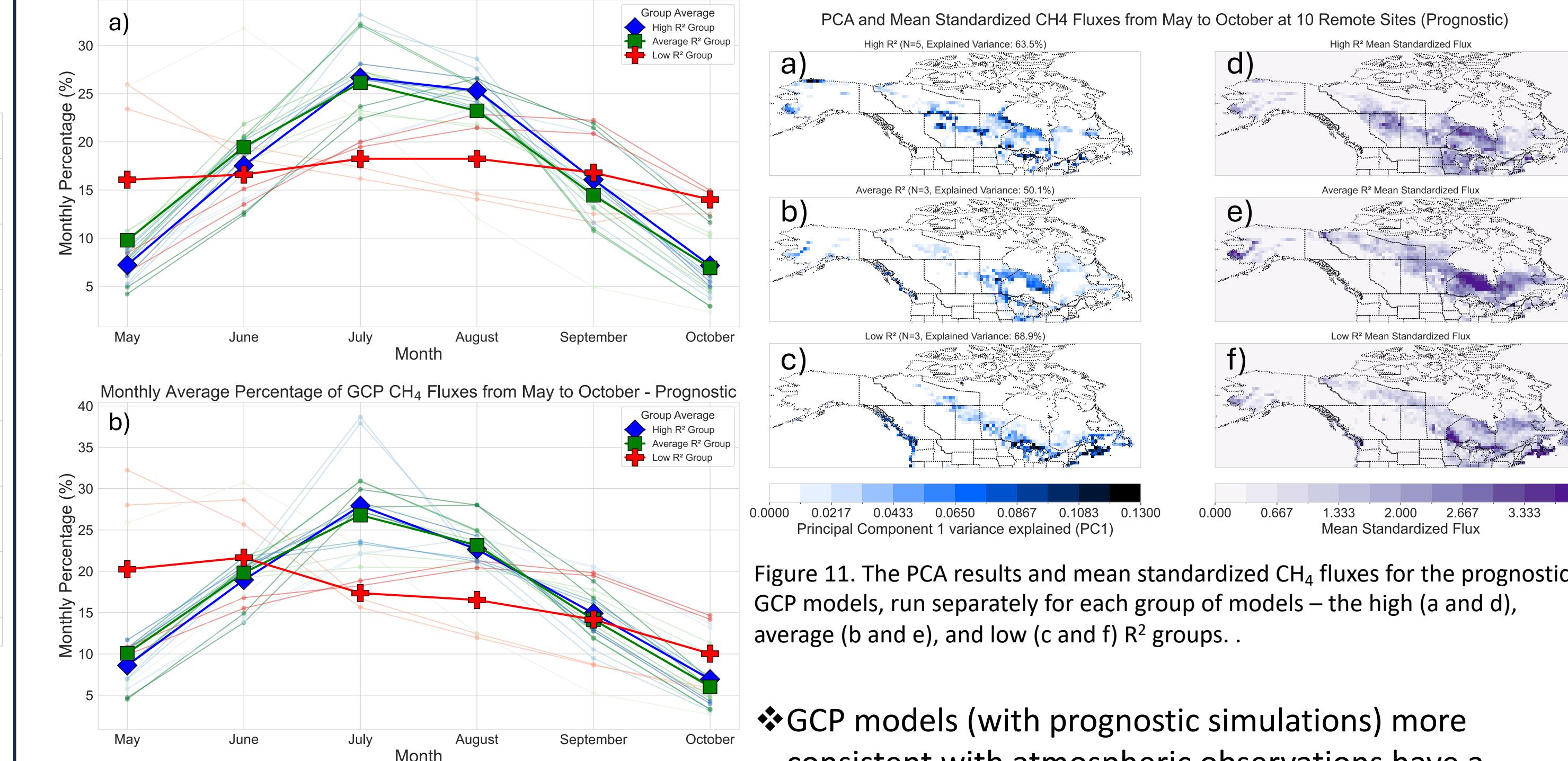


Figure 10. The seasonal cycles of the diagnostic GCP models (a) and prognostic GCP models (b) from 2007-2017. The blue, green, and red lines each represent the GCP models that have the highest, average, low  $R^2$  values with atmospheric observations. The x-axis represents the months from May to October throughout 2007-2017, and y-axis denotes the percentages of  $\text{CH}_4$  fluxes that occur within that month.

PCA and Mean Standardized  $\text{CH}_4$  Fluxes from May to October at 10 Remote Sites (Prognostic)

PCA and Mean Standardized  $\text{CH}_4$  Fluxes from May to October at 10 Remote Sites (Diagnostic)

PCA and Mean Standardized  $\text{CH}_4$  Fluxes from May to October at 10 Remote Sites (High R^2 Group)

PCA and Mean Standardized  $\text{CH}_4$  Fluxes from May to October at 10 Remote Sites (Average R^2 Group)

PCA and Mean Standardized  $\text{CH}_4$  Fluxes from May to October at 10 Remote Sites (Low R^2 Group)

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