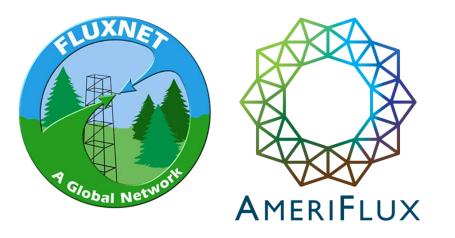
# **NC STATE** UNIVERSITY



# Developing indicators of CO<sub>2</sub> flux from Arctic wetlands

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## Introduction & Background

## Results

#### Motivation

Wetlands serve as an important sink in the global carbon cycle. Unfortunately, Arctic wetland ecosystems are more vulnerable to climate change than other ecosystems [IPCC, 2007; Erwin, 2008]. It is uncertain how carbon in Arctic wetlands will respond to climate change [ACIA, 2004; Schuur et al., 2015]. Understanding changes in CO<sub>2</sub> flux and its potential drivers is a crucial step towards determining how Arctic wetland carbon balance will change with climate change. This study synthesizes micrometeorological data from across the Arctic to investigate:



Figure 1: Warmer and drier Arctic conditions can diminish the productivity of Arctic wetland vegetation as shown in the figure on the left. This could potentially cause the wetland to shift from a sink to a source of atmospheric  $CO_2$ 

> 7 years of data

< 7 years of data</p>

DK-NúF

## CO<sub>2</sub> flux across study sites

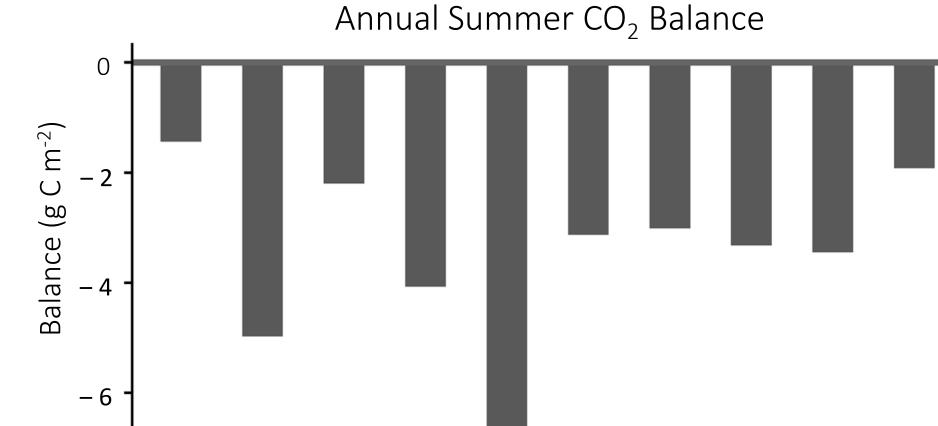
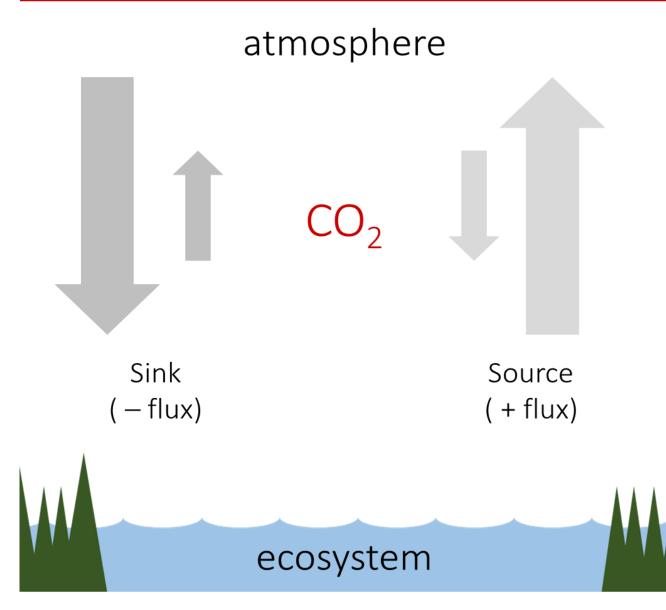




Figure 5: Each study site currently acts as a sink for atmospheric CO<sub>2</sub> although there is large site-to-site variability in the strength of the sink (left). For example, US-ICs (above, left) has the largest annual summer CO<sub>2</sub> balance while DK-ZaF (above, right) has one of the smallest annual summer CO<sub>2</sub> balances.

- How are the potential drivers of  $CO_2$  flux changing in Arctic wetlands?
- Which potential drivers best indicate changes in CO<sub>2</sub> flux in Arctic wetlands?

## Conceptual Model



I hypothesize that CO<sub>2</sub> flux can be explained by a combination of meteorological variables including:

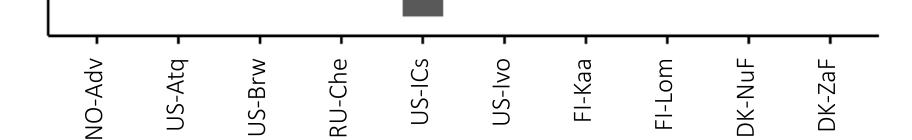
- Temperature
- VPD (Vapor Pressure Deficit)
- Precipitation
- Incoming shortwave radiation
- Evapotranspiration
- Wind speed and direction

Figure 2: Currently, Arctic wetlands act as a sink for CO<sub>2</sub>. However, two potential ecosystem responses to climate change include the wetland becoming a greater sink for  $CO_2$  or the wetland shifting from a sink to a source of  $CO_2$ .

FI-Lor

FI-Kaa

DK-ZaF



## Covariation between CO<sub>2</sub> flux and meteorological variables

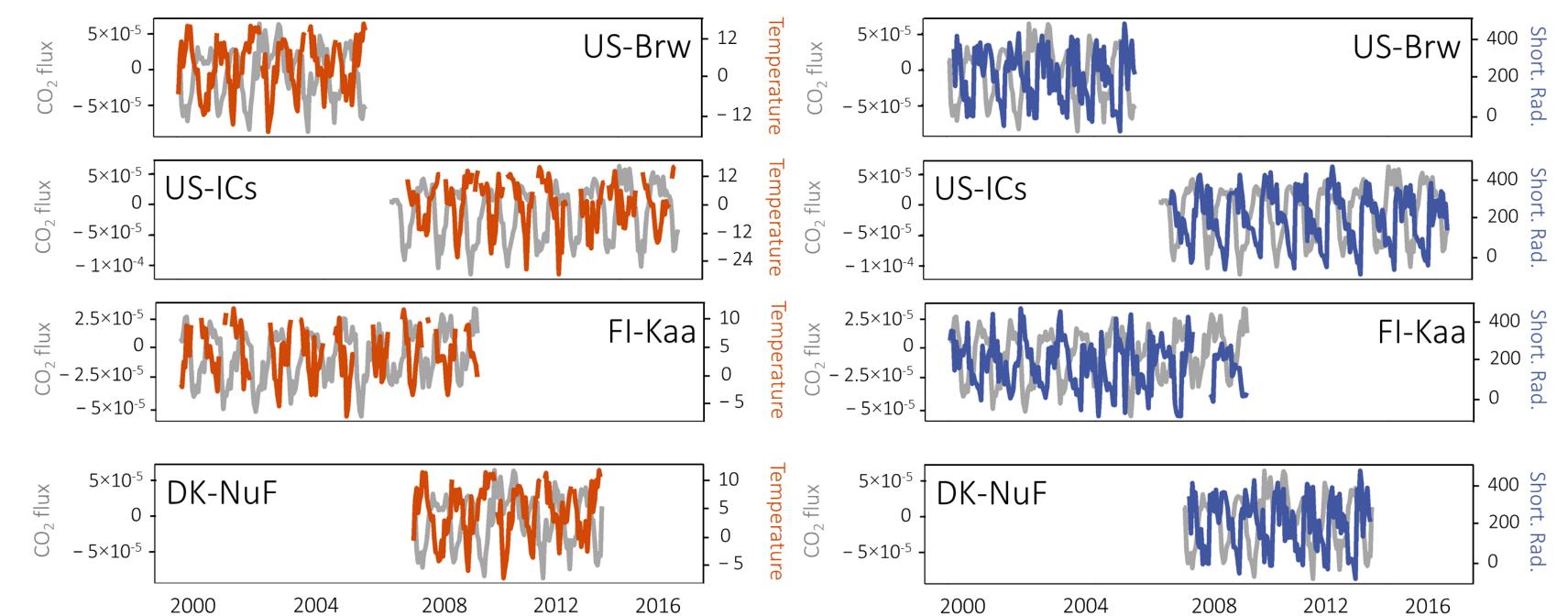


Figure 6: Weekly aggregated CO<sub>2</sub> flux, temperature, and shortwave radiation at sites with at least 7 years of data show potential covariation at times.

#### Variable Importance

## Methods

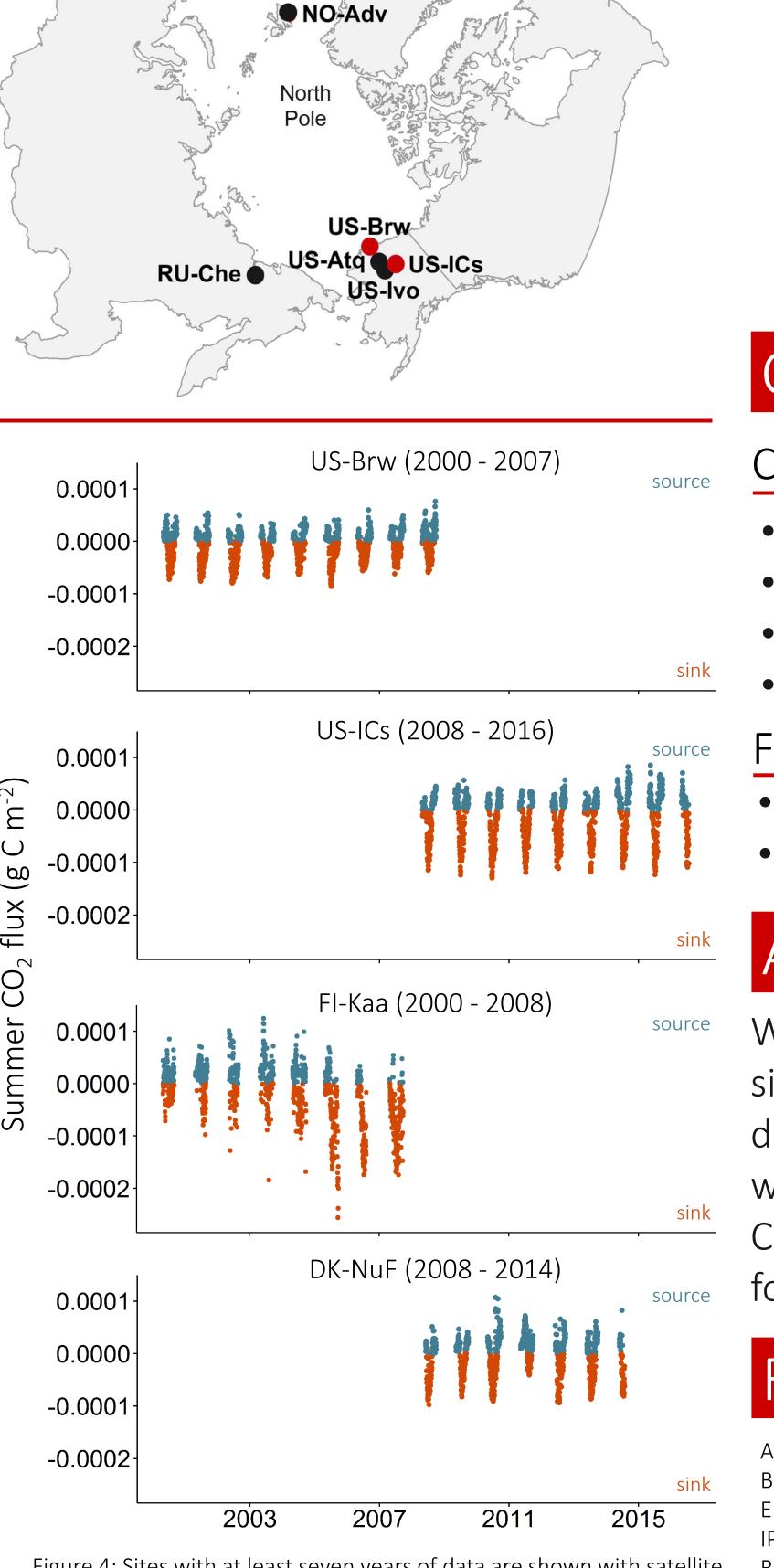
## Study Sites



Figure 3: Each study site (right) is equipped with a micrometeorological flux tower (above). Each tower takes near continuous measurements of CO<sub>2</sub> flux and various meteorological variables. Only data from the summer months were analyzed in this study.

#### Analysis

Gaps in flux tower data can occur from either instrument failure or the quality control process. Before analysis, data were gapfilled [*Reichstein et al.*, 2005]. At sites with at least 7 years of data, potential covariation between CO<sub>2</sub> flux and meteorological variables was investigated. At all sites,  $CO_2$  balance was  $\overline{P}$ calculated and a PCA was performed on the data before using a Random forest to



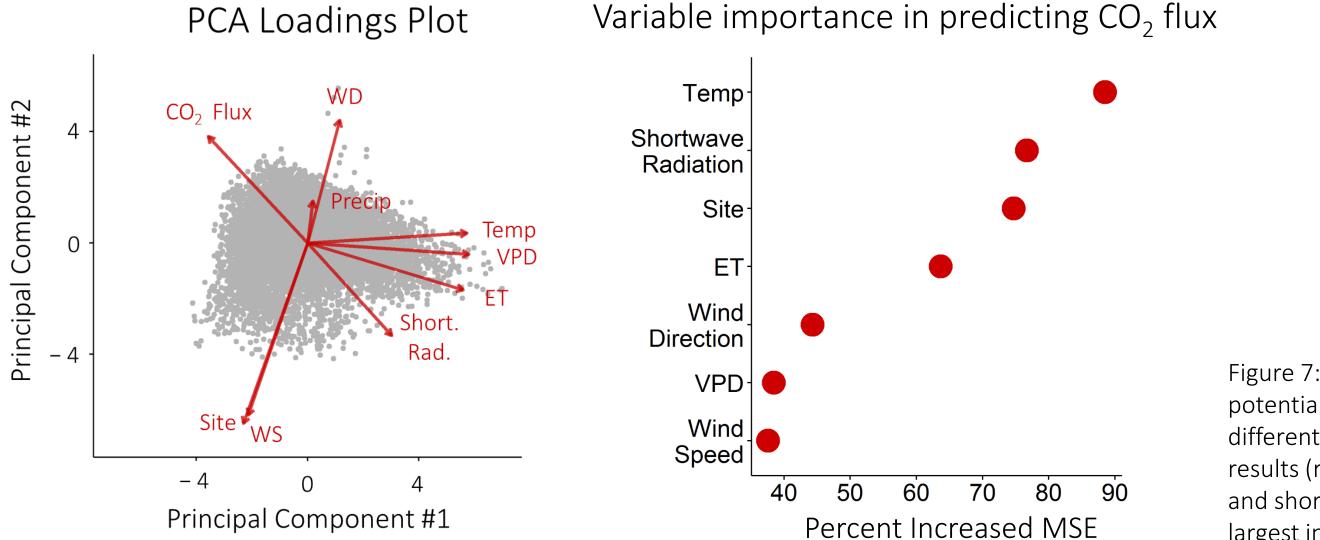


Figure 7: PCA results (left) indicate the potential relationships between different variables. Random forest results (right) indicate that tempeture and shortwave radiation have the largest influence on CO<sub>2</sub> flux.

## Conclusions & Future work

#### Conclusions

- All 10 sites act as a sink for CO<sub>2</sub> during the summer
- 2 of 4 sites show increasing CO<sub>2</sub> flux; 1 of 4 sites show decreasing CO<sub>2</sub> flux
- Most meteorological variables show strong site-to-site variability
- Temperature, shortwave radiation, and site location have largest influence on CO<sub>2</sub> flux

#### Future work

- Investigate changes in vegetation at each site
- Predict future CO<sub>2</sub> flux as with changes in climate

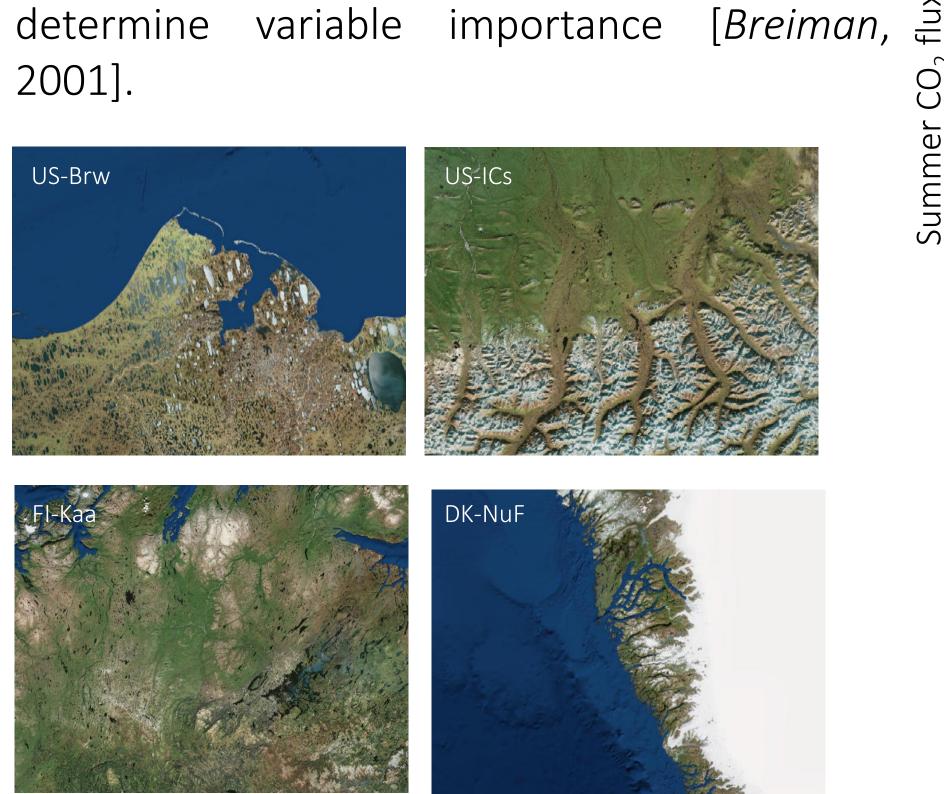


Figure 4: Sites with at least seven years of data are shown with satellite imagery (left) and as a time series of CO<sub>2</sub> flux (above). Teal and orange points show positive (source) and negative  $CO_2$  flux (sink), respectively.

## Acknowledgements

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Schuur et al. (2015), Climate change and the permafrost carbon feedback, Nature, 520, 171-179