

# Regulation of carbon dioxide and methane in small agricultural reservoirs: Optimizing potential for greenhouse gas uptake

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**Abstract.** Small farm reservoirs are abundant in many agricultural regions across the globe and have the potential to be large contributing sources of carbon dioxide (CO<sub>2</sub>) and methane (CH<sub>4</sub>) to agricultural landscapes. Compared to natural ponds, these artificial waterbodies remain overlooked in both agricultural greenhouse gas (GHG) inventories and inland water global carbon (C) budgets. Improved understanding of the environmental controls of C emissions from farm reservoirs is required to address and manage their potential importance in agricultural GHG budgets. Here, we conducted a regional scale survey (~235,000 km<sup>2</sup>) to measure CO<sub>2</sub> and CH<sub>4</sub> surface concentrations and diffusive fluxes across 101 small farm reservoirs in Canada's largest agricultural area. A combination of abiotic, biotic, hydromorphologic, and landscape variables were modelled using generalized additive models (GAMs) to identify regulatory mechanisms. We found that CO<sub>2</sub> concentration was estimated by a combination of internal metabolism and groundwater-derived alkalinity (66.5% deviance explained), while multiple lines of evidence support a positive association between eutrophication and CH<sub>4</sub> production (74.1% deviance explained). Fluxes ranged from -21 to 466 and 0.14 to 92 mmol m<sup>-2</sup> d<sup>-1</sup> for CO<sub>2</sub> and CH<sub>4</sub>, respectively, with CH<sub>4</sub> contributing an average of 74% of CO<sub>2</sub>-equivalent (CO<sub>2</sub>-e) emissions based on a 100-year radiative forcing. Approximately 8% of farm reservoirs were found to be net CO<sub>2</sub>-e sinks. From our models, we show that the GHG impact of farm reservoirs can be greatly minimised with overall improvements in water quality and consideration to position and hydrology within the landscape.

## 1 Introduction

30 The expansion of agriculture and urban land use has introduced a new type of lentic system that remains relatively unexplored – small artificial waterbodies (Clifford and Heffernan, 2018). These artificial aquatic systems have been created through human modification of the hydrological landscape and include small farm reservoirs and urban ponds. Farm reservoirs are earthen excavations designed to store water for later use (BC Ministry of Agriculture, 2013). The global abundance of these systems remains uncertain (Verpoorter et al., 2014), but statistical extrapolation suggest there may be  
35 around 16 million artificial reservoirs worldwide (Lehner et al., 2011). Regional-scale inventories indicate that collectively upwards of 8 million farm reservoirs exist in the USA (Brunson, 1999; Smith et al., 2002), China (Chen et al., 2019), India (Anbumozhi et al., 2001), South Africa (Mantel et al., 2017), and Australia alone (Lowe et al., 2005; MDBA, 2008; Grinham et al., 2018a). The density of farm reservoirs can exceed 30% of agricultural area in some regions such as China where food demand is high (Chen et al., 2019). Small agricultural reservoirs are estimated to cover 77,000 km<sup>2</sup> globally and are being  
40 created at rates up to 60% of existing reservoirs per annum in some regions (Downing et al., 2008). Given their abundance, these artificial systems may contribute substantially to landscape biogeochemical cycles, including fluxes of GHG. In particular, very little is known of the capability of these systems to act as GHG sinks to partially offset the otherwise strong carbon efflux associated with intensive agriculture (Robertson et al., 2000).

Small waterbodies have recently been recognised as substantial contributors to global carbon emissions from inland waters.  
45 Current assessments estimate that diffusive CO<sub>2</sub> and CH<sub>4</sub> emissions from small ponds (<0.001 km<sup>2</sup>) account for 15% and 40% of global emissions from lakes, respectfully (Holgerson and Raymond, 2016). Other estimates suggest emissions from small lakes and impoundments (0.001 to 0.01 km<sup>2</sup>) could constitute 40% of global CO<sub>2</sub> emissions and 20% of global CH<sub>4</sub> emissions from lentic ecosystems (DelSontro et al., 2018). Extreme CO<sub>2</sub> and CH<sub>4</sub> supersaturation is characteristic of small waterbodies due to greater contact with the sediment and littoral zone (Downing et al., 2008; Holgerson, 2015), often making  
50 them disproportionately important in landscape carbon (C) budgets (Hamilton et al., 1994; Premke et al., 2016; Kuhn et al., 2018). Conversely, ponds may have the capacity to store landscape-significant amounts of carbon, with burial rates 20–30 times higher than wetlands and large lakes (Gilbert et al., 2014; Taylor et al., 2019). While these assessments have stimulated a growing area of research on small waterbodies, much work is still needed to revise estimates of their carbon emissions due to limited knowledge on their regional distribution and variability, as well as their overall global extent  
55 (Verpoorter et al., 2014). This is particularly true for greenhouse gas (GHG) emissions from human-created small waterbodies.

Understanding the controls and rates of carbon fluxes from small artificial waterbodies is the first step required to understand their landscape and eventually global importance. Further, estimates of CO<sub>2</sub> and CH<sub>4</sub> flux are complicated by high variation among reservoirs and regions in the importance of groundwater, littoral macrophytes, and local land use practises (Pennock  
60 et al., 2010; Badiou et al., 2019). Artificial reservoirs have the potential to be potent sources of CO<sub>2</sub> and CH<sub>4</sub> (Downing et al., 2008; Holgerson and Raymond, 2016). This can be demonstrated by a carbon budget estimate from an urban pond where

carbon emissions (both diffusive and ebullitive for CH<sub>4</sub>) offset carbon burial by >1,000% (van Bergen et al., 2019). The recent 2019 IPCC Refinement has assigned a CH<sub>4</sub> emission factor of 183 kg ha<sup>-1</sup> yr<sup>-1</sup> to constructed waterbodies, however data is greatly limited, both geographically and in number (n = 68), that climatic-zone emission factors cannot be estimated (IPCC, 2019). Currently, only three studies have assessed C fluxes from small agricultural reservoirs at regional scales and these support the notion that they are important landscape sources of GHGs (Panneer Selvam et al., 2014; Grinham et al., 2018a; Ollivier et al., 2019). All studies found large fractions of CH<sub>4</sub> being released, and large mean CO<sub>2</sub> emissions on the order of 24 and 99 mmol m<sup>-2</sup> d<sup>-1</sup>, comparable to the global average flux rate of very small natural ponds (35 mmol m<sup>-2</sup> d<sup>-1</sup>, Holgerson and Raymond, 2016). However, carbon fluxes from farm reservoirs remain unaccounted in agricultural GHG inventories and global inland water carbon budgets. To facilitate their inclusion in agricultural and global budgets, we need to further constrain flux rates and mechanisms across a broad geographic area.

Here, we present a large-scale assessment of CO<sub>2</sub> and CH<sub>4</sub> concentrations from small farm reservoirs in the Northern Great Plains, the largest agricultural region in Canada. This study builds on from our previous farm reservoir GHG research which found an unexpected nitrous oxide (N<sub>2</sub>O) sink in 67% of reservoirs (Webb et al., 2019). The hydroclimate, lithology and edaphic features are vastly different compared to previous studies of agricultural areas (Australia, India, USA), with factors that favour CO<sub>2</sub> uptake by alkaline surface waters (Finlay et al., 2009; Finlay et al., 2015) and lead to high variability in CH<sub>4</sub> fluxes from regional wetlands (Pennock et al., 2010; Badiou et al., 2019). Our aim was to identify the key environmental conditions regulating CO<sub>2</sub> and CH<sub>4</sub> fluxes, and to evaluate this baseline data in the context of emission mitigation strategies. To achieve this goal, we carried out an extensive survey of CO<sub>2</sub> and CH<sub>4</sub> concentrations across 101 farm reservoirs and used generalized additive models (GAMs) to assess the effects of abiotic, biotic, hydromorphological and land use properties. Our findings show that farm dams were not always strong sources of carbon emissions and in certain cases can be carbon neutral or sinks in terms of CO<sub>2</sub>-equivalent (CO<sub>2</sub>-e) emissions. By identifying the driving characteristics of farm dams that support reduced C emissions, our findings provide the first step to developing management strategies to help minimise farm carbon emissions.

## 2 Methods

### 2.1 Study site

Farm sites were surveyed across the agricultural region of Saskatchewan, Canada (Fig. 1). This region covers an area of 235,000 km<sup>2</sup> in the southern half of the province, where agriculture accounts for ~80% of land use. The region has a sub-humid to semi-arid climate (Köppen *Dfb* classification), with short warm summers (~18°C) and long winters (~-17°C) resulting in 4.5 to 5.5 months of ice cover on surface waters (Finlay et al., 2015). Average annual precipitation in the area ranges from 354 to 432 mm.

Small farm reservoirs (known locally as ‘dugouts’) are a prominent feature of the landscape, with densities up to 10 per km<sup>2</sup> (Fig. 1B). Up until 1985, over 110,000 farm reservoirs had been constructed in Saskatchewan (Gan, 2000), although

subsequent densities are unknown. We sampled 101 farm reservoirs between July and August 2017, ranging in surface area from 158 – 13,900 m<sup>2</sup> (Table 1), including basins in pasture (n = 18), pastures with livestock (n = 62) and cropland (n = 21) sites. Each site was sampled once during this period, between the daylight hours of 10:00 to 15:00. Saskatchewan farm reservoirs are typically uniform in shape and morphometry, dug to a depth of 4 to 6 m with steep sides (1.5:1 slopes). Most shallow wetlands and lakes in the region exhibit water balances dominated by evaporation and limited inflow from winter precipitation or groundwater (Conly and van der Kamp, 2001; Pham et al., 2009). Farm reservoirs differ from small natural waterbodies in that they have a higher ratio of water volume to surface area, designed to minimise evaporation losses. Despite this feature, arid conditions persisted during the sampling year, with reduced (34-65%) annual rainfall such that many reservoirs were only half their designed depth. Natural waterbodies also tend to be high pH hard-water systems, owing to the soils which consist of glacial till high in carbonates (Last and Ginn, 2005). The same was observed for the majority of farm reservoirs, with an average pH of 8.75 (Table 1).

## 2.2 CO<sub>2</sub> and CH<sub>4</sub> measurements

Dissolved gas samples were collected using the in-field headspace extraction method (Webb et al., 2019). Briefly, water was collected from ~30 cm below the surface using a submersible pump which filled a 1.2-L glass-serum bottle, ensuring the bottle overflowed and no air bubbles were present. The bottle was sealed with a rubber stopper fitted with two three-way stopcock valves. Using two 60-mL air-tight syringes, atmospheric air was added to the bottle whilst simultaneously extracting 60-mL of water. The bottle was then shaken for 2 minutes to ensure gas equilibration in the headspace. Two analytical replicates were extracted and stored in 12-mL evacuated Exetainer vials with double-wadded caps. Headspace concentrations of CO<sub>2</sub> and CH<sub>4</sub> were measured using gas chromatography with a Scion 456 Gas Chromatograph (Bruker Ltd.) and calculated using standard curves. Dry molar fractions were corrected for dilution and converted to concentrations according to solubility coefficients (Weiss, 1974; Yamamoto et al., 1976).

To compare with the literature and assess the source/sink behaviour of the reservoirs, diffusive fluxes of carbon dioxide and methane fluxes were estimated for each water body. Given that the focus of the study was to investigate drivers of CO<sub>2</sub> and CH<sub>4</sub> concentrations across farm reservoirs, ebullition events were not measured during this survey and as such total CH<sub>4</sub> fluxes are likely underestimated. Diffusive fluxes were estimated using water column concentrations ( $C_{\text{water}}$ ) and average farm reservoir gas transfer velocity ( $k_c$ ) using the following equation:

$$f_c = k_c(C_{\text{water}} - C_{\text{air}}), \quad (1)$$

where  $f_c$  is the flux of CO<sub>2</sub> or CH<sub>4</sub> (mmol m<sup>-2</sup> d<sup>-1</sup>) and  $C_{\text{air}}$  is the ambient air concentration. The average global mixing ratios for the sampling period of 406 and 1.85 µatm were used for ambient concentrations for CO<sub>2</sub> and CH<sub>4</sub> respectively (Mauna Loa NOAA station, June to August 2017). Site-specific gas transfer velocity ( $k_c$ ) was determined from 30 individual floating-chamber (area = 0.23 m<sup>2</sup>, volume = 0.046 m<sup>3</sup>) measurements carried out on a subset of 10 reservoirs. During each 10-minute deployment, changes in gas concentrations were measured at 2.5-min intervals by taking samples using syringes

and dispensing gases into pre-evacuated 12-mL vials. The flux ( $\text{mmol m}^{-2} \text{ d}^{-1}$ ) was calculated from the observed rate of change in the dry mole fraction of the respective gas (Lorke et al., 2015). The gas transfer velocity normalised to a Schmidt number of 600 ( $k_{600}$ ) for each respective gas was then determined using measured flux, *in situ* gas concentrations, atmospheric concentration, Henry's constant, and Schmidt numbers, assuming a Schmidt exponent of 0.67. The average  $k_{600}$  calculated from the floating chamber deployments was  $1.50 \pm 1.34 \text{ m d}^{-1}$  and  $1.64 \pm 1.14 \text{ m d}^{-1}$  for  $\text{CO}_2$  and  $\text{CH}_4$ , respectively (Table 1).

For comparing  $\text{CO}_2$ -equivalent fluxes,  $\text{CH}_4$  fluxes were converted using the 100-year sustained-flux global warming potential (SGWP, Neubauer and Megonigal, 2015). This metric offers a more attainable measure of ecosystem climatic forcing, assuming gas flux persists over time instead of occurring as a single pulse as quantified using traditional global warming potentials (GWP, Myhre et al., 2013). Here, a SGWP multiplier of 45 was applied to all  $\text{CH}_4$  fluxes in the literature comparison, which is slightly higher than the traditional GWP of 32 over a 100-year time frame (Myhre et al., 2013).

### 2.3 Abiotic and biotic variables

A range of abiotic and biotic parameters were measured at each site. Water quality variables including temperature ( $^{\circ}\text{C}$ ), pH, dissolved  $\text{O}_2$  (DO; % saturation), conductivity ( $\mu\text{S cm}^{-2}$ ), and salinity were measured at 0.5-m intervals from the surface to the bottom using a YSI (Yellow Springs Instruments, OH, USA) multi-probe meter. Surface (0.5 m) samples for water chemistry were collected using a submersible pump. Upon collection, samples for dissolved nitrogen ( $\text{NO}_3+\text{NO}_2$ ,  $\text{NH}_4$ , total dissolved N;  $\mu\text{g N L}^{-1}$ ), soluble reactive phosphorus (SRP;  $\mu\text{g P L}^{-1}$ ) and total dissolved P (TDP;  $\mu\text{g P L}^{-1}$ ), dissolved organic and inorganic carbon (DOC, DIC;  $\text{mg C L}^{-1}$ ), alkalinity ( $\text{OH} + \text{HCO}_3 + \text{CO}_3$ ;  $\text{mg L}^{-1}$  as  $\text{CaCO}_3$ ), and water isotopes ( $\delta^2\text{H}$ ,  $\delta^{18}\text{O}$ ; ‰) were filtered through a 0.45- $\mu\text{m}$  pore membrane filter. Nutrient and dissolved carbon samples were stored in a dark bottle at  $4^{\circ}\text{C}$  until analysis. Chlorophyll *a* (Chl-*a*) samples were collected on GF/C glass-fiber filters (nominal pore size 1.2  $\mu\text{m}$ ) and frozen ( $-10^{\circ}\text{C}$ ) until analysis. Sediment samples were collected at the centre of each reservoir, the uppermost 10 cm using an Ekman grab sampler, and were frozen at  $-10^{\circ}\text{C}$  until analysis.

Most analyses were carried out at the University of Regina Institute of Environmental Change and Society (IECS). Water nutrient and dissolved carbon concentrations were measured on a Lachat QuikChem 8500 and Shimadzu model 5000A total carbon analyzer, following standard analytical procedures, respectively (Patoine et al., 2006; Finlay et al., 2009). Alkalinity was measured using standard methods of the US Environmental Protection Agency (EPA) on a SmartChem 200 Discrete Analyser (WestCo) and estimated as the concentration of  $\text{CaCO}_3$  (EPA, 1974). Chl-*a* was analysed using standard trichromatic methods (Finlay et al. 2009). The total carbon and nitrogen content (% dry weight) of freeze-dried sediment samples were determined on a NC2500 Elemental Analyzer (ThermoQuest, CE Instruments).

### 2.4 Hydromorphology

Morphometric parameters of reservoirs were estimated for each site. The depth of each farm reservoir was measured during using a portable ultrasonic depth sounder, taken at the deepest section in the centre of the reservoir. Surface area was

determined using Google Earth satellite imagery. Reservoir volume was calculated using the formula for a prismoid by assuming that all sites maintained their original shape, including slopes of 1.5:1 ratio (Andresen et al., 2015). From these measurements, an Index of Basin Permanence (IBP) was calculated (Kerekes, 1977).

The degree of water-column mixing or vertical stratification was determined by calculating the squared Brunt-Väisälä buoyancy frequency ( $N^2$ ,  $s^{-2}$ ). The strongest density gradient was calculated based on vertical temperature measurements at 0.5-m depth intervals using the package *rLakeAnalyzer* (Read et al., 2012) in R (version 3.5.2; R Core Team 2018).

The hydrology of farm reservoirs was estimated through analysis of  $\delta^{18}O$  and  $\delta^2H$  isotope values of water. Samples were collected from 0.5 m below the surface, filtered (0.45- $\mu m$  pore) and stored in amber borosilicate jars at 4°C until analysis using a Picarro L2120-I cavity ring-down spectrometer (CRDS). Hydrological parameters, including evaporation to inflow ratio (E/I), residence time (years), and inflow volume ( $m^3$ ), deuterium ( $^2H$ ) excess (d-excess), and  $\delta^{18}O$  inflow ( $\delta_i$ ) values, were calculated using the coupled isotope tracer method (Yi et al., 2008) and conventional isotopic water-balance methods (Gibson et al., 2001). All methods assumed that reservoirs were headwater systems in hydrological steady-state (Yi et al., 2008). Model inputs included information about the local water meteoric line (LWML), the trajectory of evaporation along a local evaporative line (LEL), and regional meteorological conditions. From here, the water mass balance of a given waterbody can be quantified based on its relative position along the LEL (Gibson et al., 2001).

Briefly, the isotopic inflow values were estimated by the intercept between the LWML and site-specific LEL as determined by  $\delta^{18}O$  evaporation value ( $\delta_E$ ) and  $\delta^{18}O$  reservoir water value at each site (Yi et al., 2008). The E/I ratio was calculated by using headwater isotopic models of the water mass balance ( $(\delta_i - \delta_L) * (\delta_E - \delta_L)^{-1}$ ). Hydrologic residence time was estimated from the reservoir volume and the water isotopic values of waterbodies, inflow, and evaporation. Deuterium excess (d-excess ‰ =  $\delta^2H - 8 * \delta^{18}O$ ) was calculated as an additional indicator of evaporation losses, where lower values (< -10‰) indicate isotopic enrichment from precipitation (Brooks et al., 2014).

## 2.5 Landscape properties

Landscape soil data was obtained from The National Soil DataBase, Government of Canada (<http://sis.agr.gc.ca/cansis/nsdb/dss/v3/index.html>) using ArcGIS to extract the soil attributes at each site. Extracted variables included soil salinity, soil pH, soil organic carbon content, saturated hydraulic conductivity ( $K_{sat}$ ), cation exchange capacity (CEC), and the total composition of soil from sand, silt, and clay fractions (%). Reservoir elevation (m, a.s.l.) was determined using ArcGIS and the Canadian Digital Elevation Model (CDEM, v1.1). Local land use in the immediate area surrounding each reservoir was categorised into three types based on local observations at the time of sampling. Categories included pasture land used for either livestock grazing or hay harvesting, pasture where livestock have direct access to the waterbody, and crop fields.

## 2.6 Statistical analyses

Environmental variables were selected based on known or presumed influence on CO<sub>2</sub> and CH<sub>4</sub> concentrations in lakes and small waterbodies. Both biotic and abiotic predictors that influence production or consumption of CO<sub>2</sub> and CH<sub>4</sub> were selected, including DO, alkalinity, NO<sub>x</sub> (NO<sub>2</sub> + NO<sub>3</sub>), NH<sub>4</sub>, dissolved inorganic nitrogen (DIN), TDN, TDP, Chl-*a*, DOC, conductivity, pH, and sediment organic C:N ratio. The influence of reservoir hydrology and morphology were also examined, including measures of surface area, basin permanence, hydrologic regime (E/I), water source ( $\delta_I$ ), and degree of mixing (or stratification). Finally, potential effects of the surrounding terrestrial landscape were estimated in models using soil properties, elevation, and land use practises to account for any localised landscape drivers. Before testing relationships, all predictors were transformed as needed using either log<sub>10</sub> or square root to remove skewness.

The relationships between covariates and CO<sub>2</sub> and CH<sub>4</sub> were estimated using generalised additive models (GAMs). GAMs provide an ideal approach to model non-linear associations between predictor variables and responses, using the sum of unspecified smooth functions to estimate trends. GAMs are not constrained by prescribed assumptions associated with parametric models such as linearity of link-scale effects in generalized linear models. Instead, the functional form of the partial relationships between covariates and the response are determined from the data. The more flexible modelling approach is useful where the effects of covariates on the response are non-linear and has been applied to complex aquatic datasets assessing GHGs (Wiik et al., 2018; Webb et al., 2019). GAMs were developed with a gamma distribution for the response and the log link function. Each model included covariates that represented hydromorphological, abiotic and biotic, and landscape controls. To avoid multicollinearity, correlation coefficients and statistical significance ( $p < 0.05$ ) between pairs from Pearson linear correlation tests was used to guide covariate choice before model fitting (Table S1-3). Candidate variables were then selected for each model to test which variables best estimate variability in CO<sub>2</sub> and CH<sub>4</sub> concentrations. All model coefficients were estimated using restricted marginal likelihood with the *mgcv* package (Wood, 2011; Wood et al., 2016) for R (version 3.5.2; R Core Team 2018).

## 3 Results

The region experienced a drier than average year during sampling, with recorded average annual precipitation ~60% less than the long-term climate average of 390 mm in Regina, Saskatchewan (Government of Canada, <http://climate.weather.gc.ca>). Consequently, while most farm reservoirs were constructed to ~5 m depth the mean water-column depth was 2.1 m (0.2-5.1, Table 1). Despite this, isotopic analysis of water revealed that 93% of waterbodies exhibited an E/I < 1.0, suggesting that reservoirs were gaining more water than was lost via evaporation. In general, water residence time was ~8 months, although the range in this value was large (29 days to 2.5 years). Estimates of inflow  $\delta^{18}\text{O}$  ( $\delta_I$ ) indicated variable water sources, with 79% derived from rain (>-15.66‰), 6% from snowmelt or groundwater (<-17.9‰), and 15% intermediate between sources (-17.9 to -15.6‰).

Carbon dioxide and methane concentrations spanned three orders of magnitude across surveyed reservoirs, with concentrations ranging between 1.3 to 326.1 and 0.1 to 54.5  $\mu\text{M}$  for  $\text{CO}_2$  and  $\text{CH}_4$ , respectively (Fig. 2). Most waterbodies were alkaline, with a mean pH of 8.8 (7.0 to 10.2) and carbonate alkalinity between 71 and 755  $\text{mg L}^{-1}$  (Table 1). Many waters were highly eutrophic, with means for Chl-*a* of 99  $\mu\text{g L}^{-1}$  (range 2 to 344  $\mu\text{g L}^{-1}$ ), total nitrogen of >3,000  $\mu\text{g N L}^{-1}$  (418 to 14,280), and total phosphorus of 285  $\mu\text{g P L}^{-1}$  (9 to 648). Dissolved  $\text{O}_2$  in the surface layer varied by three orders of magnitude among basins with 32% exhibiting oversaturation (>100%).

### 3.1 Models

Regional variation in  $\text{CO}_2$  concentrations were best estimated in a GAM including pH alone, with 86.3% of deviance explained and a strongly declining  $\text{CO}_2$  at pH above 8 (Fig. S1). Exclusive of the model with pH, the detailed mechanistic GAM for estimating  $\text{CO}_2$  concentrations across farm reservoirs included a combination of DO saturation, alkalinity,  $\text{NO}_x$ , thermal stratification (buoyancy frequency), basin hydrology (the interaction between  $\delta_i$  and WRT), and landscape features (soil CEC, elevation, soil salinity) (Fig. 3). Overall, the model explained 66.5% of deviance in  $\text{CO}_2$  concentrations (Table S4, Fig. S2). All covariates had a significant effect except soil salinity, with DO, alkalinity, and the interaction between  $\delta_i$  and WRT being the strongest predictors ( $p < 0.001$ ).  $\text{CO}_2$  concentrations displayed a positive response with increasing alkalinity,  $\text{NO}_x$ , buoyancy frequency, and soil CEC, with a generally negative response to increasing DO and elevation. The effect of DO on  $\text{CO}_2$  was particularly distinct between 25 and 100%  $\text{O}_2$  saturation (Fig. 3A). The interactive effect of hydrology parameters suggests that sites with elevated rain inflows ( $\delta^{18}\text{O} > -12.5\text{‰}$ ) and longer WRT will exhibit undersaturated  $\text{CO}_2$  concentrations.

Variation in  $\text{CH}_4$  concentrations among waterbodies were explained by a combination of DO saturation, sediment C/N ratio, DIN, conductivity, the interaction between  $\delta_i$  and WRT, and local land use (Fig. 4), with buoyancy frequency, soil  $K_{\text{sat}}$ , and elevation not significant. Overall, the GAM explained 74.1% of the deviance in  $\text{CH}_4$  (Table S5, Fig. S3). Concentrations of  $\text{CH}_4$  increased with sediment C/N and DIN and decreased with conductivity. The significant unimodal relationship with DO indicates that the highest observed  $\text{CH}_4$  concentrations occurred under both anoxic and supersaturated  $\text{O}_2$  environments (Fig. 4A), while low  $\text{CH}_4$  levels were seen when inflow was more composed of snowmelt or groundwater (depleted isotope values) and WRT was long (Fig. 4F). In contrast to the  $\text{CO}_2$  model, soil properties and elevation were not significant drivers, yet local land use was significant, with crop sites having significantly higher  $\text{CH}_4$  compared to pastures.

## 4 Discussion

Our comprehensive spatial analysis revealed wide variations among  $\text{CO}_2$  and  $\text{CH}_4$  concentrations between farm reservoirs (Fig. 2). Significant modelled environmental drivers suggested  $\text{CO}_2$  was primarily controlled by pH, with strong independent models indicating mechanisms associated with primary productivity, the hydrological regime, and landscape elevation. In



contrast, CH<sub>4</sub> was most correlated with internal abiotic and biotic mechanisms. We discuss these potential drivers in detail  
250 and from our evidence suggest management strategies that may help reduce the net GHG effect of these farm reservoirs.

#### 4.1 Environmental drivers of CO<sub>2</sub> concentrations

As seen in other hardwater ecosystems, variations in CO<sub>2</sub> were strongly coupled to differences among sites in water-column  
pH (Finlay et al., 2015; Müller et al., 2016). We demonstrate this with the strong correlation observed between CO<sub>2</sub> and pH  
in a separate GAM of only water pH as a covariate, explaining 86.3% of deviance (Fig. S1). As expected, the role of pH in  
255 regulating CO<sub>2</sub> content is most pronounced at values between 8.6-9.0, the transition point where the predominant species of  
DIC shifts from free CO<sub>2</sub> to HCO<sub>3</sub><sup>-</sup> (Duarte et al., 2008; Finlay et al., 2015). Above this value, carbonate buffering  
increasingly regulates pH and restricts CO<sub>2</sub> to only trace fractions of total DIC (Stumm and Morgan 1970). However, direct  
changes in CO<sub>2</sub> concentrations can also alter water-column pH, such as biological metabolism (Talling, 2010). Therefore,  
given the direct chemical relationship between pH and CO<sub>2</sub> concentrations (Stumm and Morgan, 1970), we opted to leave  
260 pH out of our model to further investigate the underlying biological, chemical, hydrological, and land use mechanisms.

The detailed GAM showed that variance in CO<sub>2</sub> concentrations among farm reservoirs was estimated (66.5% of deviance) by  
a combination of predictors related to water-column productivity and microbial metabolism (DO saturation, alkalinity, NO<sub>x</sub>),  
thermal stratification (buoyancy frequency), basin hydrology (the interaction between  $\delta_1$  and WRT), and landscape features  
(soil CEC, elevation) (Fig. 3), but not local soil salinity. This was shown by the DO, alkalinity,  $\delta_1$  and WRT covariates  
265 having the most significant effect at  $p < 0.001$ , while CO<sub>2</sub> concentrations did not vary significantly between different soil  
salinity levels (Table S4, Fig. 3).

Carbon dioxide and dissolved oxygen are closely linked by biological metabolism in aquatic systems and diverge when other  
chemical or physical processes occur. Here, we see evidence for both linked and divergent processes (Fig. 3A). The tight  
linear relationship between CO<sub>2</sub> and O<sub>2</sub> at 25 to 100% saturation indicates close coupling between the gases. This likely  
270 represents control via metabolic processes such as net ecosystem production (NEP) or chemical oxidation of reduced species  
(Stets et al., 2017). In contrast, relationships between CO<sub>2</sub> and O<sub>2</sub> were less well defined at both high and low oxygen  
saturation, conditions which may indicate a greater contribution from anaerobic production of CO<sub>2</sub> (Torgersen and Branco,  
2008; Holgerson, 2015). Alternatively, alkalinity buffering can mediate the effect of NEP on CO<sub>2</sub> concentrations at both  
extreme ranges of the DO spectrum (Marcé et al., 2015). Alkalinity buffering is most likely to affect CO<sub>2</sub>-DO relationships  
275 in waters where alkalinity is  $>2000 \mu\text{eq L}^{-1}$  (Stets et al., 2017) which was the case for ~90% of our sites (Table 1; Fig. 3).

Stratification can also weaken the impact of DO as a driver for CO<sub>2</sub> by regulating the effect of sediment respiration on  
epilimnetic chemistry (Huotari et al., 2009; Holgerson, 2015). Our model shows that those sites that were most stratified  
(elevated buoyancy frequency) exhibited higher CO<sub>2</sub> concentrations (Fig. 3D). This pattern contrasts those observed in other  
small lentic systems where elevated epilimnetic CO<sub>2</sub> concentrations were observed during and after breakdown of water-  
280 column stratification (Huotari et al., 2009; Glaz et al., 2016). Preliminary seasonal studies of some farm reservoirs in 2018  
show that stratification is strong and persistent throughout the summer, with no obvious diurnal mixing events. Such strong

stratification can maintain anoxic conditions throughout most of the water column, which supports intense anaerobic respiration and CO<sub>2</sub> production.

The positive association between NO<sub>x</sub> and CO<sub>2</sub> found in our reservoirs is consistent with similar patterns seen with dissolved inorganic N species in other artificial waterbodies (Ollivier et al., 2019; Peacock et al., 2019) and regional prairie lakes (Wiik et al., 2018). In some lakes, high N loading favoured elevated heterotrophy, despite simultaneous boosts in primary production which draws down free CO<sub>2</sub> (Huttunen et al., 2003; Cole et al., 2000). The effect of a high N influx on CO<sub>2</sub> may be heightened in smaller or shallow lentic waters which are more influenced by sedimentary processes (Torgersen and Branco, 2008). Further, high N availability can increase algal biomass and the deposition of fresh OM made increasingly available for bacterial respiration (Cole et al., 2000). As a result, the effect of increased benthic respiration offsets CO<sub>2</sub> uptake by primary producers, while extremely high influx of dissolved N can also favour microbial processes such as denitrification which increase CO<sub>2</sub> evolution (Bogard et al., 2017).

Hydrological controls were found to be important regulators of CO<sub>2</sub> concentrations in these farm reservoirs. Sites which received most of their inflow from snowmelt or groundwater, and which had short WRT supported supersaturated CO<sub>2</sub> concentrations (Fig. 3F). Such patterns may reflect increased inputs of groundwater which are typically supersaturated with CO<sub>2</sub> (Macpherson, 2009). Long WRT is associated with larger, deeper systems. These sites are usually less influenced by the terrestrial-aquatic interface, take longer to concentrate the effect of any catchment-derived solutes (Junger et al., 2019), and have higher biotic assimilation of nutrients (Devito and Dillon, 1993; Fairchild and Velinsky, 2006). Larger waterbodies may also be able to better mediate stream or groundwater C inputs through longer chemical processing times and transformations. For example, agricultural reservoirs with the highest WRTs tended to be hydrologically closed systems ( $E/I > 1$ ) and any watershed derived DIC delivered from previous water sources is likely to be consumed by primary production which encourages atmospheric CO<sub>2</sub> uptake (Macrae et al., 2004). Additionally, smaller waterbodies with shorter WRT can support higher rates of internal CO<sub>2</sub> production due to higher rates of allochthonous DOC mineralisation (Weyhenmeyer et al., 2015; Vachon et al., 2017).

Groundwater delivery of DIC-rich porewater is the most likely hydrological source resulting in CO<sub>2</sub> enrichment of small farm reservoirs. This mechanism is also suggested by the observation that higher reservoir CO<sub>2</sub> concentrations are predicted in high CEC soils. Alkaline high CEC soils retain more calcium ions within clay particles which releases carbonates and bicarbonates into soil porewater (Kelley and Brown, 1934). Although regional snowmelt and groundwater have similar isotopic signatures (Pham et al., 2009; Jasechko et al., 2017), the positive correlation of CO<sub>2</sub> with alkalinity suggests groundwater as the main source. Edaphic sources of inorganic carbon can result in farm waterbodies accumulating dissolved CO<sub>2</sub>, bicarbonates, and carbonates, and therefore alkalinity, from the surrounding soils via groundwater discharge (Miller et al., 1985). Other studies have found strong evidence for groundwater inputs driving CO<sub>2</sub> supersaturation in small lentic systems (Perkins et al., 2015; Peacock et al., 2019) and watershed-derived alkalinity driving CO<sub>2</sub> supersaturation in lakes (Marcé et al., 2015).

315 Finally, landscape elevation had a significant external effect on reservoir CO<sub>2</sub> and may represent diverse weak controls related to landscape setting. Lower CO<sub>2</sub> concentrations at higher elevations are common in ‘perched’ ecosystems with smaller contributing catchment areas (Diem et al., 2012) and low rates of allochthonous carbon influx (Rose et al., 2015). Conversely, waterbodies low in the landscape may receive more watershed C via groundwater influx due to topographical gradient (Winter and LaBaugh, 2003; van der Kamp and Hayashi, 2009). The effect of elevation could also be related to  
320 changes in vegetation composition within the local landscape, with the lowest lying catchments exhibiting higher abundance of marginal wetland vegetation (Zhang et al., 2010) which favours higher inputs of terrestrial C (Magnuson et al., 2006; Abril et al., 2014).

#### 4.2 Environmental drivers of CH<sub>4</sub> concentrations

The GAM suggested that CH<sub>4</sub> concentrations were primarily related to internal biogeochemical processes and the influence  
325 of the hydrological regime. For example, factors related to water column productivity (DO, sediment C/N, DIN, conductivity) had the most significant effect ( $p < 0.01$ ), while some of the broader landscape features such as soil K<sub>sat</sub> and elevation had no significant effect on CH<sub>4</sub> levels. The nutrient status of waterbodies is often a primary driver of high CH<sub>4</sub> emissions in lakes, impoundments, and ponds (Deemer et al., 2016; Beaulieu et al., 2019; Peacock et al., 2019). Consequently, high nutrient availability is likely fuelling elevated values in both O<sub>2</sub> saturation and CH<sub>4</sub> (Fig. 4A). High CH<sub>4</sub>  
330 concentrations at low O<sub>2</sub> saturation reflects the development of anoxic habitats which favours methanogenesis (Huttunen et al., 2003; Bastviken et al., 2004). This is likely the result of rapid biomass production which both enriches epilimnion with O<sub>2</sub> and depletes O<sub>2</sub> in the hypolimnion by providing fresh labile organic matter for decomposition.

In support of eutrophication-driven CH<sub>4</sub> production, our model indicated that high proportions of autochthonous organic matter in sediments were associated with elevated concentrations of CH<sub>4</sub> (Fig. 4B). Overall, sedimentary C/N ratios were in  
335 the range (8.5 to 13.4) expected for both phytoplankton and submerged macrophytes (Liu et al., 2018). This suggests that *in situ* rather than terrestrial organic matter (OM) was likely the main source of C fuelling methanogenesis in these reservoirs, although increasing CH<sub>4</sub> concentrations with C/N may also represent a larger contribution of terrestrial OM. Strong associations of labile autochthonous C and CH<sub>4</sub> production in sediments (Due et al., 2010; Crowe et al., 2011) also suggests a direct link between eutrophication and CH<sub>4</sub> production in small farm waterbodies.

340 Thermal stratification of the water column did not significantly influence surface CH<sub>4</sub> concentrations in small farm reservoirs (Fig. 4E). This finding contrasts with observations from other small waterbodies where limited mixing favours CH<sub>4</sub> accumulation (Kankaala et al., 2013). Although some small systems exhibit diurnal mixing patterns with turnover at night (Glaz et al., 2016), the wide range of buoyancy frequency values (0.00 to 0.16) suggests that at least some farm reservoirs are continuously stratified, particularly in deeper ponds (Kankaala et al., 2013), as noted for CO<sub>2</sub> distributions (see  
345 above and Fig. 3D). Taken together, our findings suggest that variability in the biological production of CH<sub>4</sub> likely exerts a stronger influence over CH<sub>4</sub> concentrations across farm reservoirs than does physical mixing, and further supports the hypothesis that the prevailing sediment and water chemistry are the primary controls of CH<sub>4</sub> concentrations.

Although the hydrological regime of small water bodies is rarely measured, we find that water source (rain, snow/groundwater) and reservoir retention time interact to influence CH<sub>4</sub> concentrations (Fig. 4F). In particular, CH<sub>4</sub> concentrations were lowest when WRT was long (>1 year) and water was derived mainly from snow or groundwater sources (δ<sup>18</sup>O depleted). This may be due to a combination of reasons, including the prevalence of sulfate delivered from groundwater (Pennock et al., 2010), dilution of waterbody from snow melt inflow, and sediments depleted in labile carbon due to longer biogeochemical processing times in the dams. The potential effect of sulfate limiting methanogenesis is in agreement with the strong negative relationship found between CH<sub>4</sub> and conductivity in our model (Fig. 4D). Sulfate makes up a large portion of the ionic composition of groundwater in the Prairie Pothole Region due to pyrite oxidation (Goldhaber et al., 2014). Evidently, the biological influence on CH<sub>4</sub> concentrations appears less pronounced in these larger, low-flow dams.

In contrast to the external drivers found for CO<sub>2</sub>, local land use had a significant effect on CH<sub>4</sub> concentrations in farm reservoirs (Fig. 4I), with significantly higher CH<sub>4</sub> levels in cropland waterbodies than those in pasture. Catchment land use regulates the physioco-chemical properties of ponds (Novikmec et al., 2016) by influencing the degree of local vegetative cover and associated influx of allochthonous C to waterbodies (Whitfield et al., 2011). Similarly, regions with crops undergo more intensive agricultural modification, with fertilisation, crop rotations, and mechanical disturbance of soil which all lead to greater nutrient runoff and soil erosion. Our finding contrasts with those from Australian farm reservoirs where diffusive CH<sub>4</sub> fluxes were 250% higher in reservoirs with livestock compared to crops, although the mechanisms responsible for observed differences were inconclusive (Ollivier et al., 2019). This difference could be the result of the intensity of agricultural production, where farm reservoirs supporting high intensity grazing may also experience high CH<sub>4</sub> production as demonstrated by a couple of high CH<sub>4</sub> concentrations observed in our livestock pasture reservoirs (Fig. 2). In this case it's likely that CH<sub>4</sub> levels are more influenced by nutrient loading from the landscape which stimulates eutrophication (Huttunen et al., 2003), as suggested by the biotic variables in our model (Fig. 4). The intensity of agricultural production under different land use types should be an area of further exploration for external controls on farm reservoir GHG production.

#### **4.3 Emissions from farm reservoirs compared to other small waterbodies**

To date, small waterbodies on farms have been shown to be large emitters of both CO<sub>2</sub> and CH<sub>4</sub> (Fig. 5). However, in our study we show that this is not always the case. Diffusive fluxes varied -21 to 466 and 0.14 to 92 mmol m<sup>-2</sup> d<sup>-1</sup> for CO<sub>2</sub> and CH<sub>4</sub>, respectively. These findings are consistent with other small artificial waterbodies which are strong CH<sub>4</sub> sources that exhibit a large range of variability from 0.02-33 mmol m<sup>-2</sup> d<sup>-1</sup> (Grinham et al., 2018a; Ollivier et al., 2019). Average CH<sub>4</sub> fluxes from our farm reservoirs correspond to 417 kg CH<sub>4</sub> ha<sup>-1</sup> yr<sup>-1</sup>, which is greater than the current IPCC emission factor estimate of 183 kg CH<sub>4</sub> ha<sup>-1</sup> yr<sup>-1</sup> (IPCC, 2019). Considering the skewness of our CH<sub>4</sub> data, our median value of 184 kg CH<sub>4</sub> ha<sup>-1</sup> yr<sup>-1</sup> agrees with the emission factor of other artificial ponds.

The negative fluxes observed in our farm dams represents one of the few studied small waterbodies that exhibit CO<sub>2</sub> sink behaviour, with most showing net heterotrophy (Fig. 5). Although other studies have noted CO<sub>2</sub> sink behaviour in artificial

ponds and reservoirs (Peacock et al., 2019; Ollivier et al., 2019), this is the first study to capture such a high proportion (>52%) of CO<sub>2</sub> uptake in such systems, with negative fluxes estimated to range between -21 to -0.1 (mean -12) mmol m<sup>-2</sup> d<sup>-1</sup> for CO<sub>2</sub> (Table 1). These flux ranges compare to CO<sub>2</sub> uptake of -1 to -11 mmol m<sup>-2</sup> d<sup>-1</sup> in agricultural eutrophic lakes of North America (Finlay et al., 2010; Pacheco et al., 2013). Studies have shown the importance of eutrophication, leading to net autotrophy, in enhancing CO<sub>2</sub> uptake and reversing carbon budgets in lakes (Pacheco et al., 2013). However, a global analysis of GHG fluxes from lakes and reservoirs revealed that the consequence of increased CH<sub>4</sub> emissions with increasing trophic status often outweighs the impact of negative CO<sub>2</sub> fluxes (Deemer et al., 2016). Here, our model shows the potential importance of reservoir placement within the landscape as a way of reducing CO<sub>2</sub> emissions via hydrological and geochemical controls without the added consequence of increased CH<sub>4</sub> emissions.

When CO<sub>2</sub> and CH<sub>4</sub> fluxes from small artificial waterbodies are compared with natural small waterbodies, no apparent trend exists in which group produces more or less carbon emissions (Fig. 5). Natural ponds and constructed waterbodies have a similar range in variability of mean fluxes for both gases, while wetlands exhibit some of the greatest within-study variability. Constructed waterbodies often have lower net CO<sub>2</sub> efflux, suggesting that these systems more often switch between net autotrophy and heterotrophy than small natural systems. Small artificial waterbodies have disproportionately higher CO<sub>2</sub> and CH<sub>4</sub> emissions than other natural waterbodies due to the direct impact of agricultural and urban land use (Wang et al., 2017). However, analysis of the limited literature shows that is not the case. We suggest that the lack of a clear distinction between constructed and naturally-occurring small water bodies arises because of geographical variation in the relative importance of the diverse factors regulating carbon metabolism (Figs. 3, 4).

When assessing the GHG impact of constructed waterbodies, it is important to consider the relative contribution to CO<sub>2</sub>-equivalent (CO<sub>2</sub>-e) fluxes between CO<sub>2</sub> and CH<sub>4</sub>. Here, CH<sub>4</sub> fluxes were converted to CO<sub>2</sub>-e fluxes using the sustained-flux global warming potential over 100 years (Neubauer and Megonigal, 2015). On average, 8% of farm reservoirs were acting as CO<sub>2</sub>-e sinks on the range of -0.6 to 79 g CO<sub>2</sub> m<sup>-2</sup> d<sup>-1</sup> during the time of sampling. This number offers a snapshot of the potential for farm reservoirs to act as a net CO<sub>2</sub>-e sink and it is important to consider how seasonal variation influences the GHG sink/source status. Preliminary data on seasonal variation in CO<sub>2</sub> and CH<sub>4</sub> concentrations from a smaller number of farm reservoirs indicate variation (represented as the standard deviation related to the mean) ranging between 20 to 200% and 40 to 200% for CO<sub>2</sub> and CH<sub>4</sub>, respectively. Here, this variation represents monthly sampling between the periods of ice melt and ice formation on water bodies in Saskatchewan. Applying the average observed seasonal variation of 78% and 93% to our current spatial dataset suggests that CO<sub>2</sub>-e emissions from farm reservoirs may vary between -1.7 and 150 g CO<sub>2</sub> m<sup>-2</sup> d<sup>-1</sup>, or 0 to 44% as acting net CO<sub>2</sub>-e sinks. Further study into the consistency of potential farm reservoir CO<sub>2</sub> sinks on the temporal scale is required to better assess the overall GHG impact.

Small natural ponds and wetlands have some of the highest CO<sub>2</sub>-e emission rates, with particular importance of contributions from CH<sub>4</sub> (Fig. 6). On average our farm reservoirs had one of the highest CH<sub>4</sub> contribution to CO<sub>2</sub>-e fluxes (74%), in agreement with the one other farm reservoir study (83%) of CH<sub>4</sub> contribution (Ollivier et al., 2019). This large contribution from CH<sub>4</sub> is similar to patterns recorded from lakes and impoundments globally, where large freshwater bodies contribute to

415 75% of all CO<sub>2</sub>-e efflux (DelSontro et al., 2018). Fortunately, because the factors that regulate CH<sub>4</sub> emissions are becoming better identified (Fig. 4), there exists the possibility that artificial wetlands can be constructed to minimize CH<sub>4</sub>-related CO<sub>2</sub>-e emissions and mitigate the overall large rate of CO<sub>2</sub>-e emissions from agriculture (Robertson et al., 2000).

**4.4 Minimising emissions: potential management solutions**

A combination of factors, including landscape position, construction, and management, could optimize features to minimize carbon emissions from reservoirs and potentially enhance the carbon storage on farms. From our models, we suggest that key variables including the degree of water column stratification (buoyancy frequency), WRT, water source, land use, and elevation are all suitable parameters for management. For example, strategizing landscape positioning to favour groundwater influx of sulfate to reduce methanogenesis. Increasing WRT by creating deeper reservoirs may promote primary production through increased water clarity (Dirnberger and Weinberger, 2005), facilitate CH<sub>4</sub> oxidation through the water column (Bastviken et al., 2008), and reduce the impact of watershed-derived solutes, terrestrial OM and benthic respiration. Additionally, deeper and larger artificial waterbodies tend to have lower nutrient concentrations due to longer processing times (Chiandet and Xenopoulos, 2016). Finally, modest increases in pH may further enhance CO<sub>2</sub> capture (Supporting Information), while having limited effect on CH<sub>4</sub> fluxes (Fig. 4).

Agricultural and urban waterbodies are highly susceptible to nutrient enrichment due to their direct proximity to intensified land uses. Reducing nutrient loading from the landscape will likely have one of the greatest impacts in minimising C emissions from farm dams given that both CO<sub>2</sub> and CH<sub>4</sub> were strongly predicted by inorganic N-species. In Australian farm reservoirs, for example, a 25% reduction of nitrates can reduce CO<sub>2</sub>-e emissions by 50% (Ollivier et al., 2019). Similarly, removing direct livestock access to farm waterbodies will improve water quality overall through reducing direct DIN inputs and dam infilling.

435 Nitrogen loading can also have a direct influence on nitrous oxide (N<sub>2</sub>O), the third most potent greenhouse gas that can contribute substantially to CO<sub>2</sub>-e emissions in farm systems (Robertson et al., 2000). The flux of N<sub>2</sub>O was constrained in our earlier study (Webb et al., 2019), which found a small CO<sub>2</sub>-e sink (-89 to -3 mg CO<sub>2</sub> m<sup>-2</sup> d<sup>-1</sup>) for the majority of these farm reservoirs despite high N concentrations. Similar to our CO<sub>2</sub> model, stratification and primary production were important regulators in driving N<sub>2</sub>O uptake (Webb et al., 2019). Therefore, the potential to achieve net GHG sinks weighs mostly on the ability to reduce CH<sub>4</sub> emissions in these systems.

Studies have also shown the importance of emergent vegetation plant species in sequestering carbon in sediments. Emergent vegetation was found to contribute significantly to the soil carbon pool of stormwater ponds compared to allochthonous sources (Moore and Hunt, 2012). However, in our CH<sub>4</sub> model, the significant effect of sediment C:N ratios suggested that an autochthonous organic matter source from either phytoplankton or submerged macrophytes supports greater CH<sub>4</sub> production in farm reservoirs. The ability of farm reservoirs to have a negative climate forcing will rely on the balance between GHG fluxes and sediment carbon accumulation. The effect different plant species and other aquatic primary producers have on

both these processes needs to be evaluated in future studies as the current design of farm dams within the study area minimises growth of emergent vegetation through steep sides and slopes.

It is important to note that the CH<sub>4</sub> contribution to CO<sub>2</sub>-e emissions is likely underestimated here as ebullition emissions were not measured. In farm reservoirs, ebullition flux can contribute >90% of total CH<sub>4</sub> emissions and is often highest in the smallest size classes (Grinham et al., 2018a). However, the sporadic nature of this pathway remains difficult to constrain for one single type of waterbody and may be a minor contributor in reservoirs and ponds > 3-5 m deep (Joyce and Jewell, 2003; DelSontro et al., 2016). This reinforces that design and management strategies that focus on reducing all pathways of CH<sub>4</sub> emissions will be most effective in curbing total CO<sub>2</sub>-e emissions. Deeper farm dams with steep side slopes will likely be effective in reducing ebullition events due to a limited macrophytes, reduced bottom water temperature in summer, and suppressed bubble release with higher water pressure (Joyce and Jewell, 2003; Natchimuthu et al., 2014; Grinham et al., 2018b).

## 5 Conclusion

Until recently, carbon emissions from small farm reservoirs have been an overlooked, yet potentially important source of CO<sub>2</sub> and CH<sub>4</sub> emissions within agricultural carbon budgets. To date, development of management strategies to reduce GHG emissions from waterbodies has been limited by lack of knowledge about the mechanisms regulating CO<sub>2</sub> and CH<sub>4</sub> production in these systems. By utilising adaptive modelling techniques across a broad range of environmental variables (abiotic, biotic, hydromorphological, landscape properties), we were able to explain a high degree of deviance in reservoir CO<sub>2</sub> and CH<sub>4</sub> concentrations. We found that *in situ* water chemistry and local hydrological regime had the strongest impact on CO<sub>2</sub> and CH<sub>4</sub> concentrations. In agreement with previous studies, CH<sub>4</sub> fluxes were the largest contributor to CO<sub>2</sub>-e emissions. However, in 19 reservoirs the net CO<sub>2</sub>-e emissions were found to be sinks. We suggest that with optimal reservoir design and management the climatic impact of farm reservoir C-emissions has the potential to be a carbon net sink. To further develop farm reservoir management practices that are locally effective, we express a need for more widespread farm waterbody GHG measurements across the globe to cover other continents and land uses.

**Data availability:** All data used in the models is available online in a GitHub repository (<https://github.com/JackieRWebb/Dugouts-CO2-CH4>). Public access to this repository will be made available upon publication and a DOI will be generated at this time.

**Supplement:** The supporting information related to this study will be published online.

**Author contributions:** J.R.W., G.L.S., P.R.L., H.M.B., and K.F. designed research; J.R.W. performed research and wrote the paper; H.M.B. contributed new reagents/analytic tools; H.A.H., P.R.L., G.L.S., and K.F. contributed towards ideas and data analysis; K.R.H performed GIS analysis; and G.L.S. developed models.

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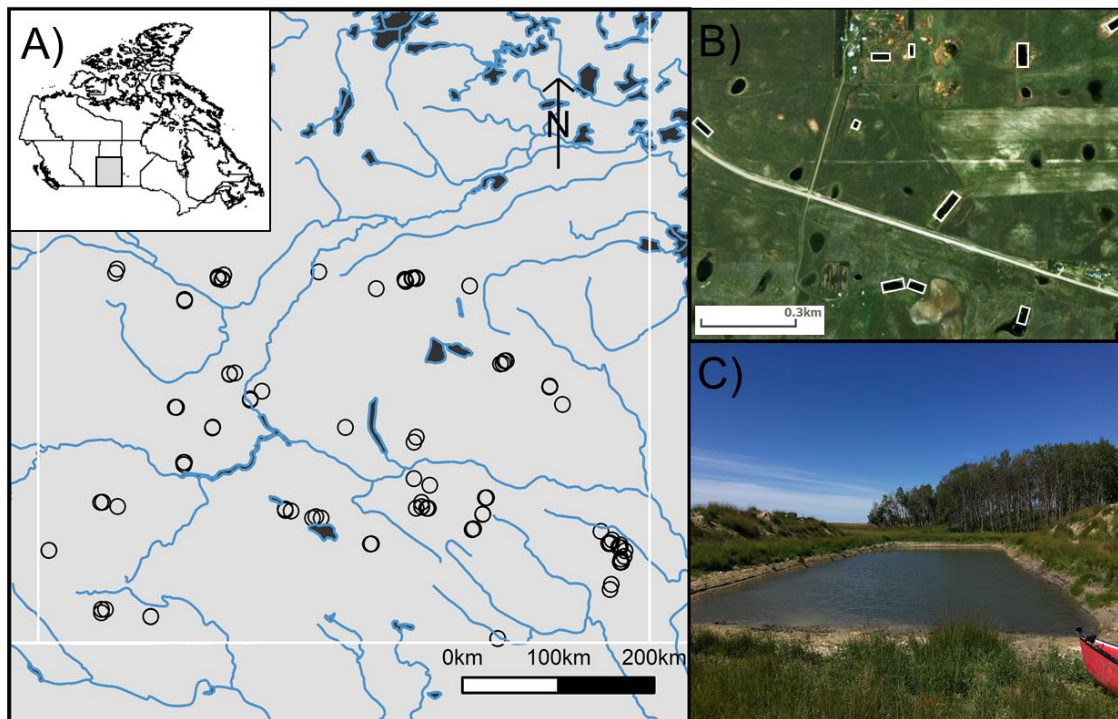
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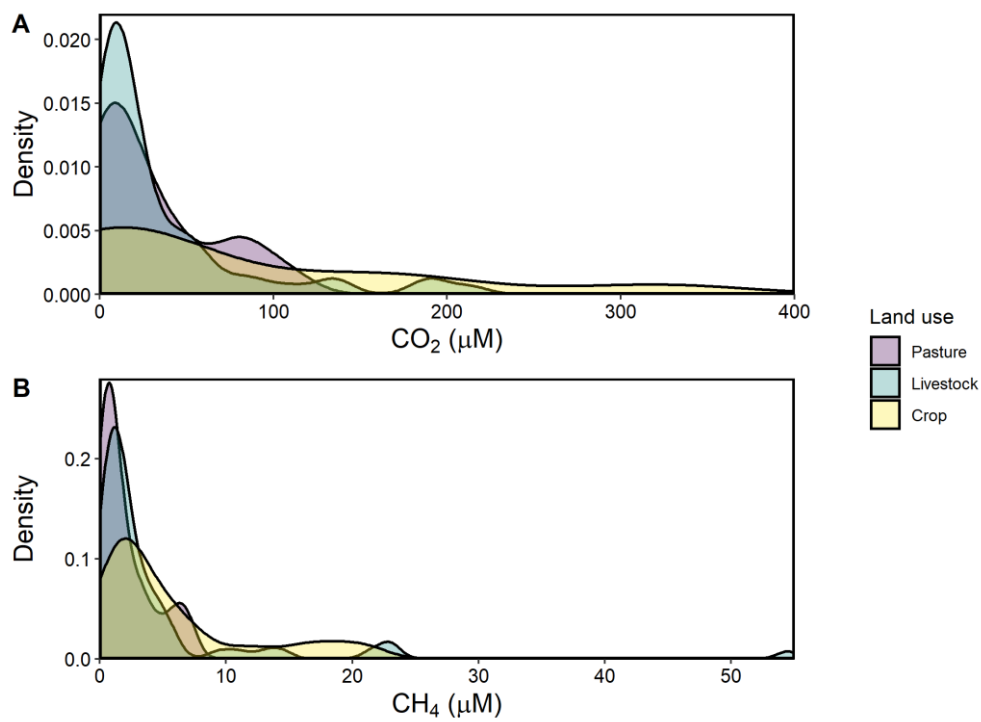
## Tables and Figures

**Table 1: Farm reservoir and landscape physical, hydrological, and chemical characteristics of the study sites (n = 101)**

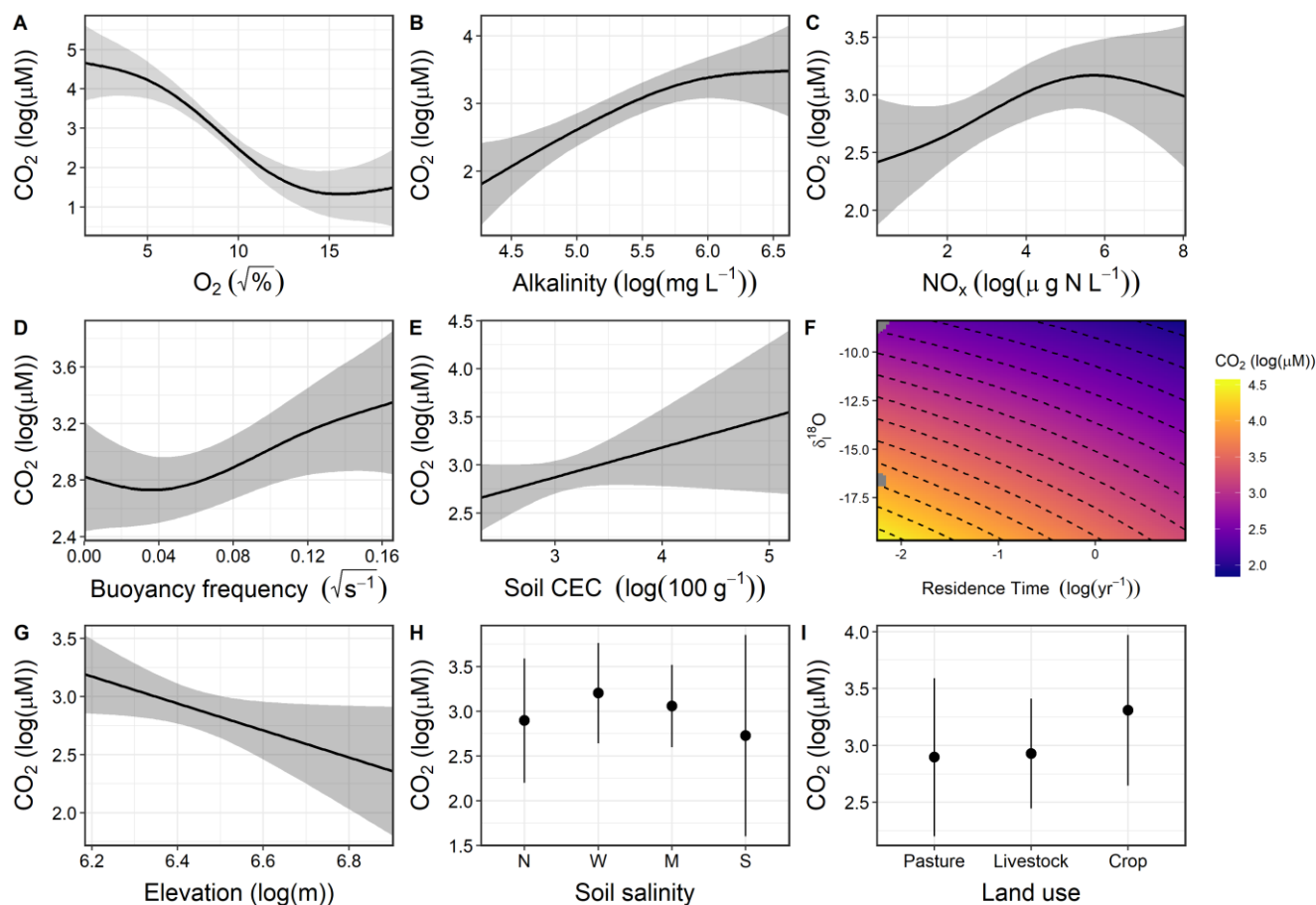
	<i>Units</i>	<i>N</i>	<i>Mean</i>	<i>Median</i>	<i>Min</i>	<i>Max</i>
Area	m <sup>2</sup>	101	1,312	1,040	158	13,900
Depth	m	101	2.08	2.10	0.18	5.10
Buoyancy frequency	s <sup>-2</sup>	99	0.01	0.005	0.00	0.03
δ <sup>18</sup> O inflow	‰	101	-13.37	-13.33	-19.39	-8.40
Evaporation to inflow		101	0.46	0.43	0.04	1.58
Water residence time	Years	100	0.76	0.66	0.08	2.51
CO <sub>2</sub>	μM	101	42.2	14.6	1.3	326.1
CH <sub>4</sub>	μM	101	4.3	1.9	0.1	54.5
Flux CO <sub>2</sub>						
<i>Positive</i>	mmol m <sup>-2</sup> d <sup>-1</sup>	47	100.1	58.1	0.1	466.2
<i>Negative</i>	mmol m <sup>-2</sup> d <sup>-1</sup>	54	-11.9	-13.3	-21.3	-0.1
Flux CH <sub>4</sub>	mmol m <sup>-2</sup> d <sup>-1</sup>	101	7.1	3.2	0.4	91.5
k600- CO <sub>2</sub>	m d <sup>-1</sup>	15	1.50	0.98	0.20	4.12
k600- CH <sub>4</sub>	m d <sup>-1</sup>	23	1.64	1.25	0.38	4.14
Temperature	°C	101	20.1	19.9	15.7	29.5
Dissolved O <sub>2</sub>	%	101	92.6	88.9	2.3	344.0
Salinity	ppt	101	0.9	0.5	0.1	8.6
pH		101	8.75	8.75	6.95	10.19
Chlorophyll a	μg L <sup>-1</sup>	101	99.1	36.9	2.2	2,483
NH <sub>3</sub>	μg N L <sup>-1</sup>	100	354.7	100.0	10.0	5,930
NO <sub>x</sub>	μg N L <sup>-1</sup>	98	196.6	34.1	1.2	3,188
TP	μg P L <sup>-1</sup>	98	285.2	80.0	8.7	6,480
TN	μg N L <sup>-1</sup>	98	3,082	2,360	417.5	14,280
DOC	mg C L <sup>-1</sup>	99	31.8	29.3	4.6	90.4
Sediment organic carbon	%	101	5.2	3.9	0.6	31.4
Sediment organic nitrogen	%	101	0.6	0.4	0.1	2.8
Alkalinity	mg L <sup>-1</sup>	96	245.4	219.2	71.0	755.5
Soil CEC	M-eq 100g <sup>-1</sup>	98	24	24	10	180
K <sub>sat</sub>	cm hr <sup>-1</sup>	101	9.9	5.0	0.0	39.7
Elevation	m	101	627.6	598.0	484.0	997.0



**Figure 1: A) Map of southern Saskatchewan in Canada showing the distribution of studied farm reservoirs, B) aerial image showing 10 farm reservoirs delineated by white rectangles within a 1 km<sup>2</sup> area, and C) general size and shape of farm reservoirs with two characteristic side mounds of excavated materials.**

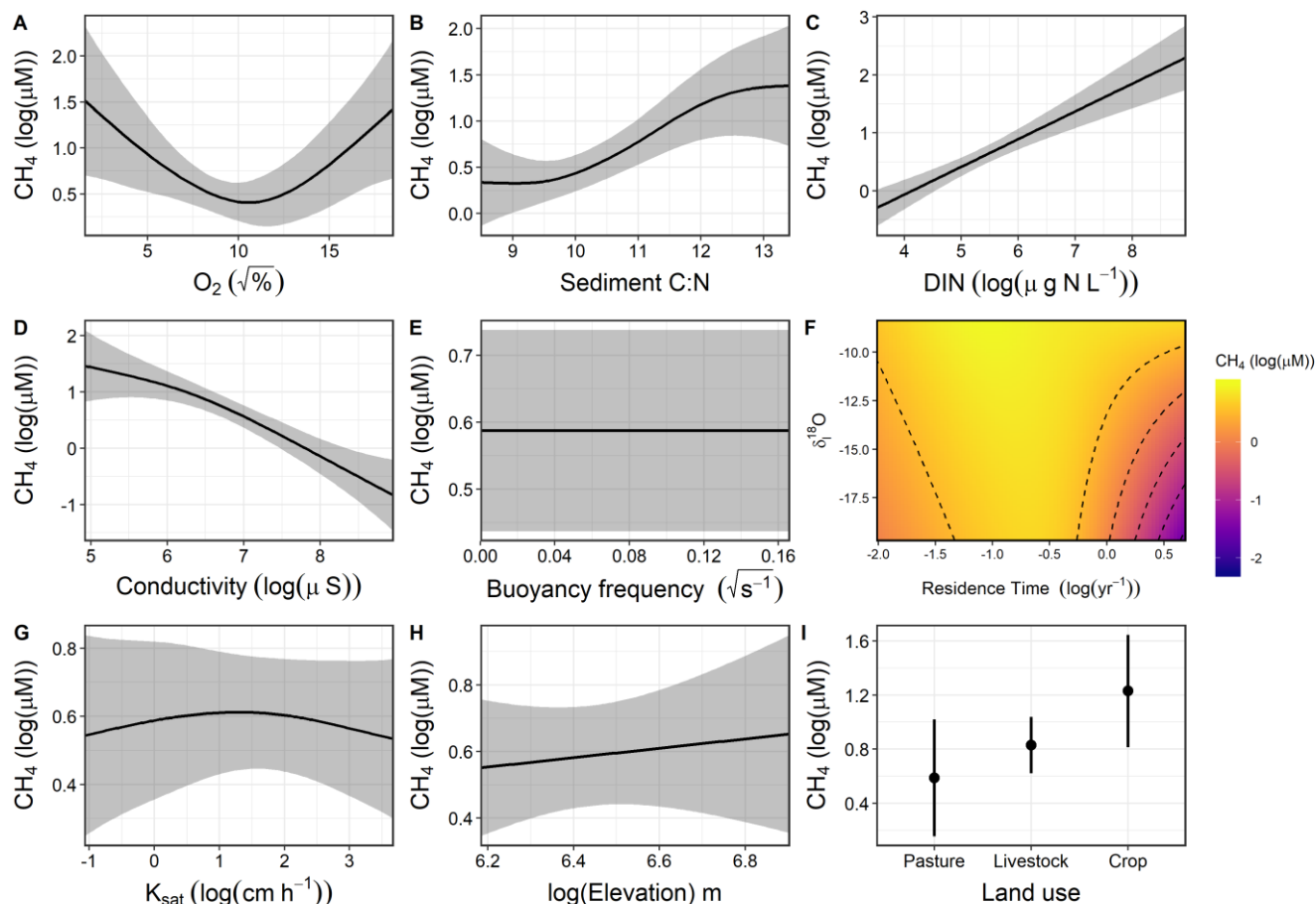


**Figure 2: Kernel density estimates of CO<sub>2</sub> and CH<sub>4</sub> concentrations measured in 101 farm reservoirs grouped by land use.**

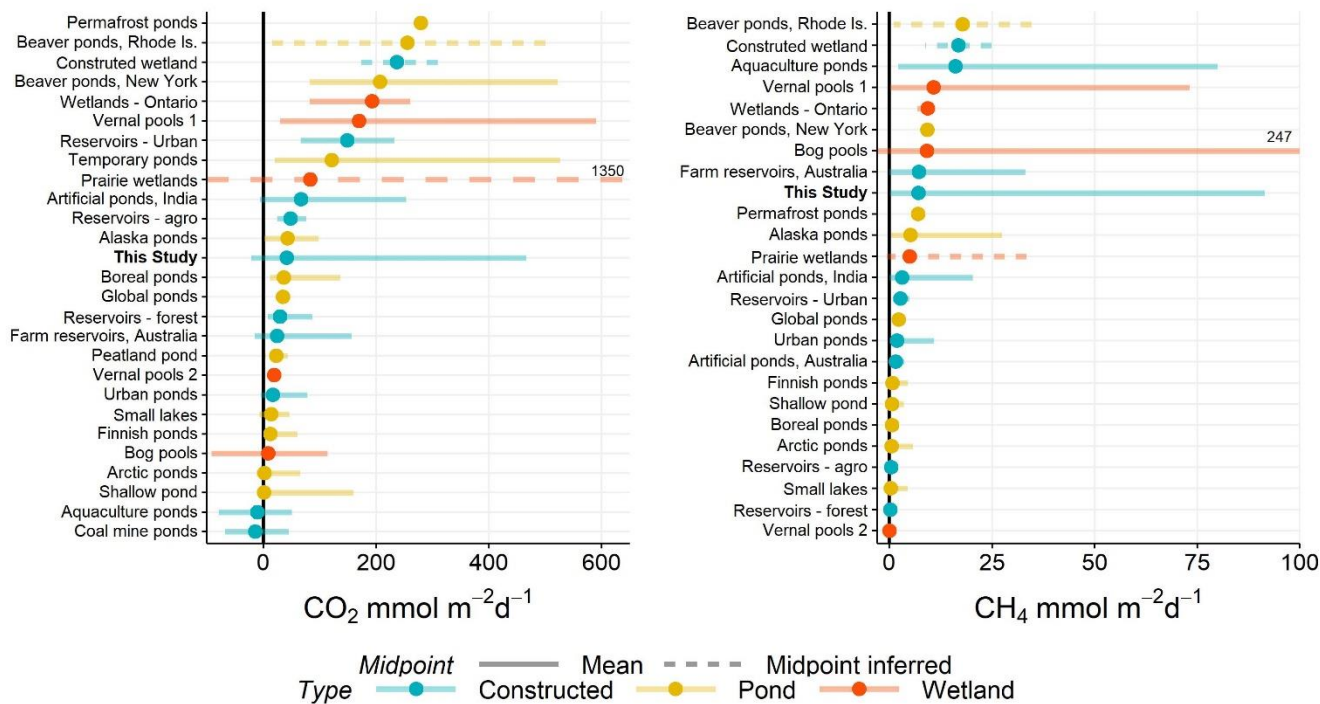


**Figure 3: Response patterns farm reservoir CO<sub>2</sub> concentrations with abiotic, biotic, hydromorphological, and landscape variables based on GAMs.** CO<sub>2</sub> was best estimated by a combination of a) DO saturation, b) alkalinity, c) NO<sub>x</sub>, d) buoyancy frequency, e) interaction between  $\delta^{18}\text{O}$  and WRT, f) soil CEC, g) and elevation, with soil salinity (h) and land use (I) not significant. Model deviance explained was 66.5%. The response patterns shown are the partial effect splines from the GAM (solid line) and shaded area indicated 95% credible intervals. See Table S4 and Figure S2 for summary of model statistics and model fit with observed data.

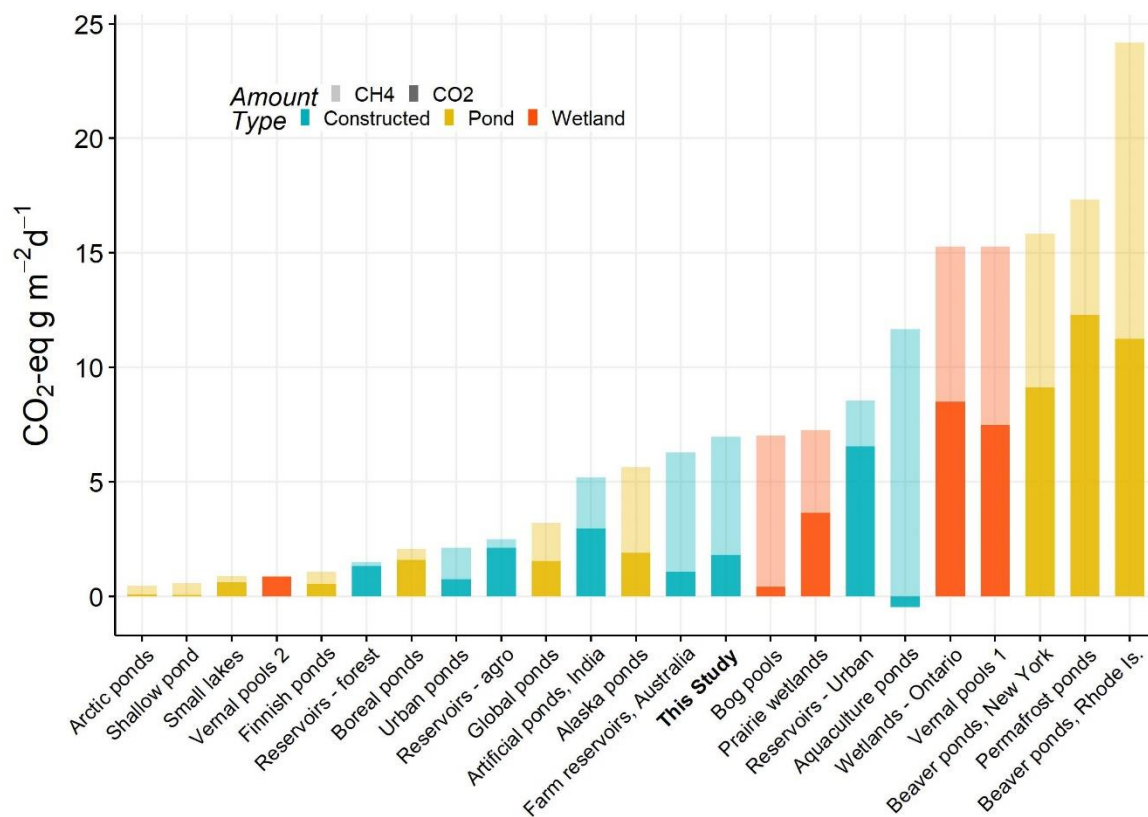




**Figure 4: Response patterns farm reservoir CH<sub>4</sub> concentrations with abiotic, biotic, hydromorphological, and landscape variables based on generalised additive models (GAMs).** CH<sub>4</sub> was explained by a combination of a) DO saturation, b) sediment C/N, c) DIN, d) conductivity, e) buoyancy frequency (not significant), f) interaction between  $\delta^{18}\text{O}$  and WRT, g) soil Ksat (not significant), h) elevation (not significant), and i) local land use. Model deviance explained was 74.1%. The response patterns shown are the partial effect splines from the GAM (solid line) and shaded area indicated 95% credible intervals. See Table S5 and Figure S3 for summary of model statistics and model fit with observed data.



755 **Figure 5: Range of CO<sub>2</sub> and CH<sub>4</sub> (diffusive) fluxes observed in natural and constructed small (<0.01 km<sup>2</sup>) waterbodies, including this study (farm reservoirs). Dots represent the mean reported in each study and error bars the range. If no mean value was reported, then the midpoint was inferred as the middle of range (dashed lines). Solid black line distinguished between positive and negative fluxes. All data is from the published literature and references can be found in the Table S6.**



760 **Figure 6: Total average CO<sub>2</sub> equivalent fluxes of CO<sub>2</sub> and CH<sub>4</sub> (diffusive) measured in natural and artificial small waterbodies (<0.01 km<sup>2</sup>). CO<sub>2</sub>-e fluxes were calculated based on 100 year sustained-flux global warming potentials in Neubauer and Megonigal (2015). Relative proportions of each gas are indicated by shading, and waterbody type is given by colour. All data is from the published literature and references can be found in the Table S6.**