Greenhouse gas emissions from diverse Arctic Alaskan lakes are dominated by young carbon

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Climate-sensitive Arctic lakes have been identified as conduits for ancient permafrost-carbon (C) emissions and as such accelerate warming. However, the environmental factors that control emission pathways and their sources are unclear; this complicates upscaling, forecasting and climate-impact-assessment efforts. Here we show that current whole-lake CH_4 and CO_2 emissions from widespread lakes in Arctic Alaska primarily originate from organic matter fixed within the past 3-4 millennia (modern to 3,300 \pm 70 years before the present), and not from Pleistocene permafrost C. Furthermore, almost 100% of the annual diffusive C flux is emitted as CO_2 . Although the lakes mostly processed younger C (89 \pm 3% of total C emissions), minor contributions from ancient C sources were two times greater in fine-textured versus coarse-textured Pleistocene sediments, which emphasizes the importance of the underlying geological substrate in current and future emissions. This spatially extensive survey considered the environmental and temporal variability necessary to monitor and forecast the fate of ancient permafrost C as Arctic warming progresses.

akes are more abundant in the Arctic than in any other region and emit more CH₄ than any other natural Arctic source, contributing 6% (16.5 Tg CH₄ yr⁻¹) to global natural CH₄ emissions^{2,3}. Current CH₄ emission estimates from Arctic lakes vary by a factor of two (11.9–24.2 Tg CH₄ yr⁻¹) (refs ⁴⁻⁶), and future estimates from all permafrost-region sources span three orders of magnitude⁷. Discrepancies persist because of uncertain climate projections⁸ and because current lake-C-emission data sets fail to capture the complexity of Arctic-lake types⁹, specifically, their geological settings¹⁰, potential C sources^{11,12} and CH₄ versus CO₂ emission pathways^{13,14}.

Approximately 20% of the total lake area in northern permafrost regions formed via thermokarst, in which degradation of ice-rich permafrost results in subsidence, ponding and thaw of the underlying sediments11. The initiation and expansion of thermokarst lakes is sensitive to climate change¹⁵, and has been identified as a mechanism for the rapid decomposition of ancient (defined here as \geq 11,500 years years before the present (YBP), that is, late Pleistocene and older) permafrost C and its emission to the atmosphere¹⁶⁻¹⁸. Under a warming climate, there is the potential for an enhanced decomposition and emission of this ancient and vast C reservoir to provide a positive feedback to climate change¹⁴. Yet, the ability of thermokarst lakes to act as conduits for permafrost C emissions to the atmosphere as CH₄ has only been verified in lakes that actively thaw into yedoma, a fine-textured, C- and ice-rich, aeolian sediment of the Pleistocene steppe. These environmental conditions comprise just 12% (150,000 km²) of the landscapes with prevalent lake thermokarst (1,300,000 km²) in the northern circumpolar permafrost region (18,410,000 km²) (refs 10,11), and therefore under-represent the environmental diversity of Arctic lakes.

Current estimates of permafrost C loss from lakes are based on age measurements (radiocarbon (14C) dating) of CH₄ emitted by ebullition (bubbling). Measured ages are highly variable, ranging from 40,000 YBP to modern (C fixed from the atmosphere after 1950) within a single lake^{16,17,19,21}. Ebullition itself is highly sporadic, and daily rates can span three orders of magnitude^{13,22-24}. And, although ebullition is probably the primary CH₄ emission pathway in actively expanding yedoma–thermokarst lakes (79% of the total emissions on average)^{2,18}, diffusive CH₄ emissions can dominate whole-lake emissions in non-yedoma systems^{13,25}. Furthermore, northern lakes can also be large CO₂ sources²⁶, but few studies have simultaneously quantified CH₄ and CO₂ emissions^{22,27} or their C-source ages²⁸, which leaves an incomplete understanding of the role of lakes in the climate feedback of permafrost C.

Study location and approach. This study quantified whether ancient permafrost or young organic C (OC) dominates whole-lake C emissions from lakes on Alaska's North Slope, and the proportion emitted as CH₄. In our 250,000 km² study region, lakes are a dominant landscape feature², formed by a variety of processes, which include thermokarst, in a diverse range of geological substrates³. Most of the North Slope remained unglaciated during the most-recent glacial maximum (~27–19 kyr ago) and has accumulated sediments with varying OC³0 and ice content³¹. The general surficial geology is delineated by mixtures of marine gravel, sand, silt and clay (coastalplain geology), glaciomarine deposits near the Beaufort and Chukchi Sea coasts³,³², a 250×60 km² zone of aeolian sand further inland³³, yedoma-type aeolian silt along the northern edge of the Brooks range³⁴ and rivers that flow south to north with floodplain corridors underlain by fluvial sand and glacial outwash (Supplementary Fig. 1).

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We quantified the 14C age, 13C content and concentrations of mass-integrated, whole-lake diffusive CH₄ and CO₂ in up to 40 lakes that span seven geological sediment types³⁵, thermokarst and non-thermokarst lake types, and a 3.5 °C gradient in mean annual air temperature (Supplementary Table 1). The 40 lakes were studied over two winters (April 2013 and April 2014), and seven were studied during one summer (August 2014). Isotope measurements were made on CH₄ and CO₂ dissolved beneath floating ice in late winter, when the majority of any ebullition gas, trapped beneath the ice, would have dissolved into the lake water over the ice-cover season³⁶. We assume that the 14C signature of dissolved ebullition gas would alter the whole-lake dissolved ¹⁴C signature by the principle of mass balance (see equation (8)), and that the below-ice 14C signature of dissolved gases represents the mass-integrated value of the wholelake emissions. Cumulative daily C fluxes for the open-water period were estimated by extrapolating the mean of triplicate dissolved CH_4 and CO_2 measurements, made on either a single day (n=7)or on two days (one week apart) (n=2) in August 2014, using daily air and water temperature, and daily wind speed. Annual diffusive emissions (gC) of CH4 and CO2 were estimated for each lake surveyed in the summer by adding an estimate of the springtime iceout diffusive flux (based on below-ice accumulation) to cumulative daily fluxes from the ice-free period (Table 1 (Methods)).

We estimated the mean and probable range of ancient permafrost C contributions to the whole-lake emissions of CH₄ and CO₂ with a five-source isotope mass-balance model³⁷. Carbon-source categories included C fixed from the atmosphere during 1950–2012 (which represents ¹⁴C-enriched CO₂ from nuclear weapons testing), in 2013 (recent photoassimilates), 5,000 YBP (mid-Holocene), 11,500 YBP (end of the Pleistocene) and from ¹⁴C-free sources (>50,000 YBP) (equation (8)).

Sources of CH₄ and CO₂ emissions. All lakes but one were oversaturated in CH₄ and CO₂ (n=40) (Fig. 1 and Supplementary Table 2). When an estimate of the ice-out flux is included, we found that all the lakes were sources of C to the atmosphere. Mean daily fluxes were $6.2\pm3.4\,\mathrm{mg}\,\mathrm{CH_4}\,\mathrm{m^{-2}}\,\mathrm{d^{-1}}$ and $2,620\pm2,240\,\mathrm{mg}\,\mathrm{CO_2}\,\mathrm{m^{-2}}\,\mathrm{d^{-1}}$ (n=7), and within the range previously reported from North Slope lakes using similar methods²⁷. Total lake-C emissions from the study area were $0.94\pm0.14\,\mathrm{Tg}\,\mathrm{Cyr^{-1}}$ (C here is diffusive C-CO₂+C-CH₄) (Table 1) and C-CO₂ emissions were over 180 times larger, on average, than C-CH₄ emissions.

Ages of whole-lake diffusive C emissions were much younger (Fig. 2 and Table 1) than the age of CH₄ emitted from yedomathermokarst lakes in Siberia and Central Alaska^{16,17} and the age of permafrost C sources (>50,000 to 6,000 YBP)¹⁹. Ages ranged from modern to 3,300 ± 70 YBP for dissolved CH₄, and from modern to 1,590 ± 20 YBP for dissolved CO₂. The lake-category-weighted mean 14 C ages for the study region were 847 YBP for CH₄ (n=49measurements) and 392 YBP for CO_2 (n=68). In all lakes but one, dissolved CH₄ was on average 400 ¹⁴C-years older than CO₂ (Fig. 2 and Table 1). This may reflect a combination of modern atmospheric CO₂ equilibrating with lake waters, CO₂ production from the aerobic decomposition of younger organic material produced within lakes and imported from surrounding soils, and methanogenesis being fuelled by older sedimentary and soil C sources. Stable isotope data (δD and $\delta^{13}C$ ($\delta^{13}C = [(^{13}C/^{12}C)_{sample}/(^{13}C/^{12}C)_{standard}] - 1))$ of CH₄ confirmed a microbial CH₄ origin in our lakes³⁸. In our study, the δ^{13} C of dissolved CH₄ below ice was $-56.7 \pm 12.4\%$ (n=16) (Supplementary Table 2), which again indicates microbial CH_4 ($\delta^{13}C < -50\%$) (ref. ³⁹). The ¹⁴C and ¹³C data both demonstrate that lake-C emissions originated primarily from the degradation of recently formed terrestrial C, such as shallow-lake sediment C and

Geology type	Total	Below-	Fluxes	Diffusive CH₄	Fraction of	Mean age of	Diffusive CO ₂	Fraction of	Mean age of
Geology type	lake area (km²)	ice ¹⁴ C measured (<i>n</i> lakes (CH ₄ , CO ₂))	measured (August 2014)	emissions ^a (g CH ₄ km ⁻ ² yr ⁻¹)	CH ₄ sourced by ancient C (mean (10th to 90th percentile range))	CH ₄ emissions (YBP (mean ± -s.d., error if n=1))	emissions ^a (g CO ₂ km ⁻ ² yr ⁻¹)	CO ₂ sourced by ancient C (mean (10th to 90th percentile range))	CO ₂ emissions (YBP (mean ± -s.d., error if n=1))
Glaciomarine	538	1, 2	1	1.1 x 10 ⁶	0.23 (0.0- 0.50)	1,809 ± 163 ^b	1.1 x 10 ⁶	0.17 (0.0- 0.38)	1,029 ± 626
Coastal plain	3,383	9, 10	3	7.9 x 10 ⁵	0.21 (0.0- 0.45)	1,560 ± 478	4.1 x 10 ⁸	0.15 (0.0- 0.35)	809±334
Aeolian silt	483	3, 8	2	7.5 x 10 ⁵	0.19 (0.0- 0.45)	1,280 ± 473	3.8 x 10 ⁸	0.15 (0.0- 0.35)	719 ± 431
Aeolian Sand	3,028	9, 9	1	3.2 x 10 ⁵	0.11 (0.0-0.25)	253 ± 422	2.9 x 10 ⁸	0.09 (0.0- 0.23)	18±32
Glacial young ^c	167	1, 2	n.m.	n.m.	0.08 (0.0- 0.25)	0±15	n.m.	0.14 (0.0- 0.35)	603±884
Fluvial old ^c	560	1, 1	n.m.	n.m.	0.11 (0.0-0.25)	97±25	n.m.	0.09 (0.0- 0.20)	0 ± 25
Fluvial young ^c	506	3, 6	n.m.	n.m.	0.08 (0.0- 0.20)	0±50	n.m.	0.10 (0.0- 0.25)	200±358
Observed total	8,664	40	7						
North Slope Total ^d	10,659	40	7	$(5.0 \pm 0.8) \times 10^{-3}$ $(Tg C-CH_4 yr^{-1})$	0.14 ± 0.05 (flux-weighted (mean \pm s.d.))	847±798 (area-weighted (mean±s.d.))	0.94 ± 0.16 (Tg C-CO ₂ yr ⁻¹)	0.11±0.03 (flux-weighted (mean±s.d.))	392±495 (area-weighted (mean±s.d.))

*Assumes the diffusive flux occurs only during ice-free days (mean = 122 d), incorporates fluctuating water temperatures and wind speeds in 2014, and the additional total mass loss of CH_4 and CO_2 during the spring melt (ice-out flux). This estimate does not include potential ice-free ebullition. Error range represents the s.d. of the ¹⁴C age of CH_4 within one lake measured in both 2013 and 2014. Where open-water fluxes were not measured (n.m.), annual fluxes were prescribed from other geology category means based on similar below-ice dissolved CH_4 and CO_2 concentrations. Extrapolated from the observed lake area of 8,664 (81% of the total lake-area survey).

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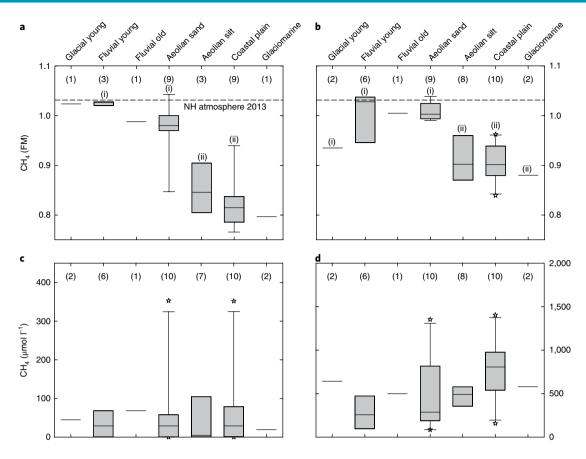


Fig. 1 ¹⁴C content and concentration of below-ice dissolved CH₄ and CO₂ by geological unit. a-d, Box plots of lake-dissolved 14 C-CH₄ contents (a) and 14 C-CO₂ contents (b), expressed as fraction modern (FM), and dissolved CH₄ (c) and CO₂ (d) concentrations in relation to surficial geological unit³⁶. Values are averaged from the 2013 and 2014 winter measurements. Dashed horizontal lines indicate the 14 C signature of atmospheric CO₂ in the summer of 2013. Boxes indicate the 25th and 75th percentiles, and error bars are the 10th and 90th percentiles. Solid horizontal lines within boxes indicate the median. Open stars are outliers. Numbers within the parentheses indicate the number of lakes observed in each geological unit. Statistically different groups with respect to mean 14 C age are indicated by either (i) or (ii) (single-factor ANOVA and Tukey's HSD post hoc analysis (F(4, 21) = 19.49, $P = 7.92 \times 10^{-7}$) and (F(4, 30) = 10.85, $P = 1.46 \times 10^{-5}$) for CH₄ and CO₂, respectively).

surrounding soil C, rather than fossil C seeping through gaps in the permafrost from near-surface coal beds⁴⁰ or from C in sublake thawed sediments (talik) deposited during the Pleistocene¹⁶.

Seasonal effects on dissolved CH₄ and CO₂ isotopes. Comparing winters within the same lakes, dissolved CH₄ was 38% older on average in 2014 than in 2013 (p < 0.05, n = 12); however, we found no difference in the ages of dissolved CO₂ (p > 0.05, n = 19). Seasonally, the mean age of dissolved CH₄ in the winter was 180 14 C-years older than that in the summer (p < 0.05, n = 6), and the mean age of dissolved CO₂ in the winter was 620 ¹⁴C-years older than that in the summer (p < 0.05, n = 6). The older CO₂ observed below ice probably reflects a diminished aerobic decomposition of fresh (and young) organic material beneath the ice, and/or limited atmospheric exchange through the ice. We also found strong evidence for the oxidation of CH4 into CO2, which could also explain the older below-ice CO₂ values because CH₄ was consistently older than the concomitant CO₂. The mean ¹⁴C values of coexisting dissolved CH₄ and CO₂ were positively correlated across all the study lakes (r = 0.93, p < 0.05, n = 26) (Fig. 2). This relationship implies CH₄ oxidation in the water column, in which the resulting dissolved CO₂ carries the ¹⁴C signature of the oxidized CH₄. However, co-production of CH₄ and CO₂ with the same ¹⁴C signature in sediments during acetate fermentation may also be a factor, especially where coexisting CH₄ and CO₂ are closer in ¹⁴C age. If we assume that CH₄

oxidation is the only factor that alters the 14C signature of belowice dissolved CO2, a two-source 14C mass-balance mixing model (which utilizes the previous summer ¹⁴CO₂ and winter ¹⁴CH₄ values as the end members) can be used to estimate that $60 \pm 15\%$ (n = 5)of below-ice dissolved CO₂ may have originated from oxidized CH₄. In support of this hypothesis, we found that below-ice dissolved CH₄ was enriched in ¹³C in six lakes (δ¹³C ranged from -39.5‰ to -19.0%) relative to the common products of methanogenesis $(\delta^{13}$ C from -110 to -50%) (ref. ³⁹). Likewise, significant negative relationships between below-ice dissolved CH₄ concentrations and δ^{13} CH₄ in lakes when δ^{13} CH₄> -60% were also observed ($R^2 = 0.59$, n=4 in 2013, and $R^2=0.91$, n=7 in 2014 (p<0.05)). Both observations are indicative that CH₄ consumption enriches the ¹³C in residual dissolved CH₄ in a semiclosed system below ice. Together, these findings support our observations that the dissolved C-CO₂ pool was four times larger than the C-CH₄ pool, that below-ice CH₄ oxidation may age the dissolved C-CO₂ pool and that within-lake CH₄ oxidation regulates the global warming impact of Arctic lakes.

Emission ages in relation to geological substrate. The interannual and seasonal variation in mean gas ages for individual lakes was small compared with the age differences observed across geological units (around 160%). Across the North Slope, C-emission ages were clearly related to the surficial geological unit that underlies the lakes (Figs. 1 and 3). Dissolved CH_4 and CO_2 were significantly younger

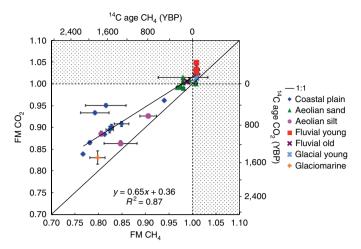


Fig. 2 | Radiocarbon content of coexisting dissolved CH₄ and CO₂ below ice. Values, expressed as FM and 14 C age (YBP), represent the belowice mean values from April 2013 and April 2014 (n = 2) or either the 2013 or 2014 value (n = 1). Error bars represent the s.d. when n = 2, or the procedural and analytical error when n = 1; in either case, the larger of the two is shown. Larger errors for CH₄, relative to CO₂, represent a combination of greater interannual variability and smaller sample size, for which procedural and analytical errors are more impactful. A greater distance from the 1:1 line indicates a greater 14 C content (age) difference between CH₄ and CO₂. Values greater than FM = 1 (shaded area) indicate samples that contain C fixed from the atmosphere post calendar year 1950.

in lakes in sandy and fluvial deposits compared with those in finer-textured coastal, glaciomarine and aeolian silt (yedoma-type) deposits (p < 0.05, Single factor analysis of variance (ANOVA) and Tukey's honest significant difference (HSD) test and post hoc analysis) (Fig. 1). Mean gas ages in lakes that reside on glacial deposits were not significantly different from gas ages in any other geological unit.

Sedimentary OC. The geological substrate incorporates sediment texture, and thus the ground ice content, thermokarst behaviour and C-retention properties of the landscape. In contrast with lakes that form in sandy deposits, lakes in finer, ice-rich sediments exhibit a greater post-thaw subsidence, and thus can quickly degrade deeper (and presumably older) permafrost9. Also, as fine-textured Pleistocene aeolian silt on the North Slope sequestered more C, lakes that formed into such deposits have more ancient sedimentary OC available within their taliks for potential decomposition than lakes in sand, given similar thaw depths. We determined that the OC content of aeolian silt $(0.95 \pm 0.34\% \text{ OC}, n = 38)$ was relatively OC rich compared with that of the adjacent aeolian sand $(0.19 \pm 0.10\% \text{ OC},$ n = 29) (p < 0.05) (Supplementary Table 3). This result is similar to previous reports of the North Slope silt³⁴, yet less than that of other yedoma-type sediments¹⁰. The large difference in sedimentary OC observed between sand and silt is also reflected in the five-source isotope model solutions, in which ancient C accounts for an average of 15% of the whole-lake C emissions (CH₄ plus CO₂) from lakes in silt versus 9% from those in sand (Fig. 4 and Table 1). As finer deposits dominate both ends of our transects, we found no correlation of CH₄ or CO₂ age with latitude or mean annual air temperature. Hence, our results demonstrate that local environmental heterogeneity (that is, variable % OC in the substrate) is a better proxy for whole-lake diffusive C-emission ages than is broad climatic regulation on the North Slope.

Regional CH₄ and CO₂ fluxes. Our regional assessment clearly demonstrates that terrestrial C, fixed from the atmosphere within

the past few millennia, is the dominant source of whole-lake C emissions on the North Slope today, and that the current emissions of ancient C are minimal and restricted to lakes that reside in finetextured sediments (Figs. 1, 3 and 4). The annual diffusive CH₄ flux extrapolated from all the lakes (total lake area, 10,659 km²) in our study region (231,157 km²) was $(5.0 \pm 0.8) \times 10^{-3}$ Tg C-CH₄ yr⁻¹, of which ancient permafrost C sources contribute a mean of 14%, with a range of 0-38% (10th to 90th percentile range of the mixing-model solutions) (Fig. 4 and Table 1). This is equivalent to an ancient C flux of 7.2 × 10⁻⁴ Tg C-CH₄ yr⁻¹ (Table 1). The total annual diffusive CO₂ emissions were $0.94 \pm 0.14 \,\mathrm{Tg}\,\mathrm{C}\text{-}\mathrm{CO}_2\,\mathrm{yr}^{-1}$, with a mean contribution of 11% (range from 0 to 25%) from ancient C (Fig. 4 and Table 1). Ancient C-CO₂ emissions (0.10 Tg C-CO₂ yr⁻¹) were 150 times greater than that via CH₄, which implies that CO₂ diffusion is the dominant pathway for ancient C loss from the North Slope.

Discussion and conclusion. Emissions of C to the atmosphere from ancient sources amplify climate warming because they represent a net addition to the active C cycle. Emissions of ancient C were greatest per unit area $((1.7\pm0.5)\times10^7\,\mathrm{g\,C\,km^{-2}\,yr^{-1}})$ and collectively $((5.7\pm2.0)\times10^{10}\,\mathrm{g\,C\,yr^{-1}})$ from the lakes in the coastal plain geology unit (Table 1). This is a result of the greater overall lake area (Table 1), a higher proportion of ancient C that contributes to the emissions and a relatively older CO_2 that accounts for a higher proportion of the total diffusive flux (Table 1). Recent work suggests that increasing winter water temperatures are preventing lakes in this region from freezing completely in the winter¹⁵, which potentially allows aged organic material in newly developing taliks to contribute to greenhouse-gas production.

The ancient C flux was dominated by diffusive CO₂ emissions $(0.10 \pm 0.01 \,\mathrm{Tg}\,\mathrm{C-CO_2}\,\mathrm{vr^{-1}},\,\mathrm{or}\,99\%$ of the total ancient C emissions (Table 1)). Ice-free CH₄ ebullition was neither directly observed nor estimated in our study. However, if ice-free ebullition represented 79% of the total ice-free CH₄ emissions (as observed in vedoma-thermokarst lakes²) and was sourced completely from ancient C, cumulative emissions of ancient C via CO2 diffusion would still exceed the CH4 emissions (diffusion plus the hypothetical ancient ice-free ebullition of 0.02 Tg C-CH₄ yr⁻¹) in our region by over a factor of four. Nevertheless, in this unlikely scenario the climate-warming potential of ancient C emissions as CH₄ is far greater than that of CO₂, because CH₄ is 30 times more effective as a net radiative forcer on a molecule-to-molecule basis and on a 100-year timescale⁴¹. Ancient C flux as CH₄ would outweigh the global warming potential of observed ancient C emission via CO₂ diffusion if ice-free CH₄ ebullition comprised roughly 70% of the total diffusive CH₄ emissions in our study lakes $((5.0 \pm 0.8) \times 10^{-3} \text{ Tg-C-CH}_4 \text{yr}^{-1})$ and was purely sourced from ancient C. This finding emphasizes the need for climate feedback studies of permafrost C to distinguish CH₄ from CO₂ emissions and whether each gas is predominantly sourced from ancient or young C.

Our regional-scale assessment provides an important baseline dataset for monitoring the emission sources of CH₄ and CO₂ from the climate-sensitive North Slope lakes. It also demonstrates that lakes in Arctic Alaska currently emit CH₄ and CO₂ predominantly from C pools that cycle between the land and atmosphere on timescales of decades to four millennia, even in areas where the lakes are actively eroding into relatively C-rich Pleistocene permafrost. Consequently, the Alaskan Arctic lakes are important systems for processing and returning freshly fixed C back to the atmosphere. Future emissions of ancient C are likely to increase, but our work provides further evidence that they will be restricted to areas in which the combination of warming temperatures, ancient OC and thermokarst favour the development of new or expanding taliks and shorelines^{18,42}. Finally, diffusive CO₂ emissions from young C

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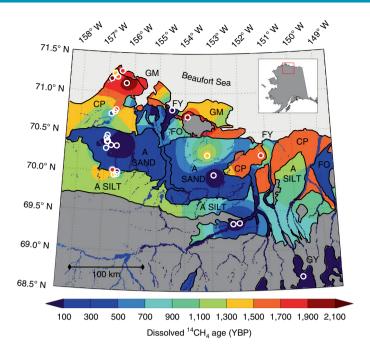


Fig. 3 | Mean ¹⁴C age of dissolved CH₄ in thaw lakes interpolated across Alaska's North Slope. Circles indicate the location of 27 lakes measured for below-ice dissolved ¹⁴CH₄ (n=1-2 per lake). Methane ages were interpolated using inverse distance weighting with a 1/20 weight reduction parameter for predictions in non-similar geology categories (equations (9)-(11)), which gives the effect of pronounced geology boundaries. Major geological boundaries are also emphasized with black lines. Geological units: A. sand, aeolian sand; A. silt, aeolian silt; CP, coastal plain; FO, fluvial old; FY, fluvial young; GM, glaciomarine; GY, glacial young. Grey areas represent unobserved geological units. Methods and Supplementary Fig. 2 give an estimate for the quantitative uncertainty for this interpolation and Supplementary Fig. 1 depicts the lake distribution and geological units.

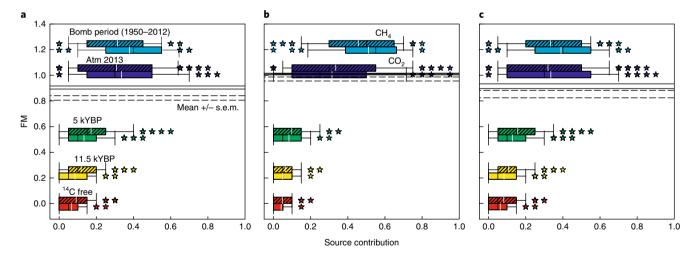


Fig. 4 | Source apportionment of lake-dissolved CH₄ and CO₂ below ice. Proportional source contributions to the mean ¹⁴C signature of dissolved CH₄ are shown with hashed boxes, with open boxes for that of CO_2 . **a**, Lake coastal plain geology (n lakes = 9, n mass-balance solutions = 411 (CH_a) and 200 (CO_2)). **b**, Aeolian sand $(n=9, n=171 \text{ and } 46; \text{ sedimentary } \% \text{ OC} = 0.19 \pm 0.10)$. **c**, Aeolian silt $(n=3, n=632 \text{ and } 295; \text{ sedimentary } \% \text{ OC } 0.95 \pm 0.34)$. The dashed and solid horizontal lines denote the ± standard error range around the observed mean ¹⁴C values for CH₄ and CO₂ in each geological unit, respectively. The boxes show the mean (vertical white line), median, first and third quartiles, and the range of all the possible source contributions to the mean ¹⁴C value. Stars represent mass-balance solutions outside the 10th to 90th percentile range (whiskers), and are treated as outliers. The text and Methods describe the end members and mass-balance calculations. Atm, atmosphere.

sources currently account for nearly all (99%) of gaseous C loss from the North Slope lakes. Our multiyear regional lake survey concludes that future Arctic greenhouse-gas-emission research must consider the complexity of lake-forming processes, the variable geological settings of the entire circumpolar region and whether relatively fresh and young C or decomposing ancient permafrost C dominate the C cycling of Arctic lakes.

Methods

Methods, including statements of data availability and any associated accession codes and references, are available at https://doi. org/10.1038/s41558-017-0066-9.

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Author contributions

C.D.E, X.X., J.W., C.I.C, B.V.G. and J.W.P. performed the measurements. J.L.S. developed the methodology and produced the figures for the spatial $\mathrm{CH_4}$ interpolations. C.D.E, C.I.C, K.M.H., A.T.-S., C.D.A. and B.V.G. were all involved with the field logistics and sampling. B.V.G. contributed to all the work and data related to the sedimentary organic C content sampling. All the authors participated in the interpretation and presentation of the results.

Competing interests

The authors declare no competing financial interests.

Additional information

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Methods

Sample collection. Water and dissolved-gas samples were collected from 40 lakes (≥0.27 ha) on the North Slope of Alaska, USA (Supplementary Table 1). The lakes are part of the Circum-Arctic Lakes Observation Network (CALON, www.arcticlakes.org). The CALON lakes are distributed along a 'western' and an 'eastern transect that spans 150 and 300 km and is centred along the −156.5° W and −151.9° W parallels, respectively. On each transect, the lakes are divided into 3–8 clusters, which span local lake sizes Most lakes are shallow (mean 2.4 m, range 0.5–11.8 m) and probably well mixed. Along each transect, coastal lakes are characterized by cooler summer temperatures and a shorter ice-free period than lakes located further inland 44.

For radiocarbon (14 C) analyses of dissolved CH₄ and CO₂, the lakes were sampled near their centres twice a year, with and without ice cover, in North Slope lake in 2013 and 2014. During the winter (April) of 2013 the CALON team collected water from below the ice from 19 lakes on the western transect and 17 lakes on the eastern transect, and in the winter (April) of 2014 from 23 lakes solely on the western transect. A hole 25 cm in diameter was drilled with an Eskimo auger (Shark Z51 (Eskimo)) and 1.31 of water were collected without headspace into Nalgene square polyethylene terephthalate (PETE) media bottles with natural high density polyethylene screw caps (342040-1000 (Thermo Scientific)). As the sample froze, the bottles expanded to accommodate the volume change. Once thawed, the bottles regained their original shape. Samples were frozen in the field and kept frozen until further processing at the University of California (UC) Irvine.

During the summer, samples were collected in surface waters near the centre of each lake using a novel gas-extraction technique with a Liqui-Celpmembrane contactor. Lake water was pumped (1.21 min⁻¹) for 60 min through a series of four particulate filters (178 and 40 µm stainless-steel mesh filters T-29595-39 and T-2959-35 (Cole-Parmer), and 20 μm and 5 μm 5" polypropylene sediment depth filters SD-25-0520 Flow-Pro and SD-25-0505 Hydronix (FreshWatersystems)) and past a degassing membrane contactor (Liqui-Cel (Membrana)), in which bulk dissolved gases (including N2, CH4 and CO2) were collected in a pre-evacuated, pre-weighed 21 stainless steel canister with a stainless steel bellows sealed valve (SS-4BG (Swagelok)). To prevent cross-contamination, all the filters were replaced and the system was flushed with lake water for 30 min prior to each sampling event. To prevent microbial activity, the whole system was flushed with dilute H₃PO₄ acid for 10 min and then clean tap water for 15 min daily (after about four samples) and stored dry. This system eliminates the need to store and ship an average of 1001 of water for the extraction of ≥0.1 mg C-CH₄, or approximately 10 l for the same amount of C-CO₂ per sample for ¹⁴C analysis. At the same time and location, we measured water temperature and pH (PCD 650 (Oakton Instruments)).

During the summer of 2014, the lakes were also analysed for dissolved $\mathrm{CH_4}$ and $\mathrm{CO_2}$ concentrations. At the centre of each lake, three replicates of 20 ml of surface lake water were manually injected into capped (blue butyl rubber septa, CLS-4209-14 (Chemglass Life Sciences)) pre-evacuated 40 ml crimp-sealed glass vials over the course of 2 h. The vials were pre-loaded with 20 μ l of aqueous mercuric chloride to inhibit microbial activity.

General surficial geological units. The descriptions of each general geology unit defined in this work (coastal plain, aeolian sand, aeolian silt, fluvial old, fluvial young, glaciomarine, and glacial young) are already published³⁵.

Laboratory analyses. Radiocarbon analysis. Dissolved gases were extracted from frozen water samples collected during the winter. One day prior to extraction, and when still frozen, the original screw caps on the sample bottles were replaced with septum caps (38–430 Microlink Open Top, Wheaton, custom 1/8" thick butyl rubber septa (McMaster-Carr)) in a pure N_2 atmosphere. The sample was then left to thaw at room temperature overnight. Post-thaw, a 15% headspace was created with ultrapure N_2 (NI UHP300 (Airgas)) in the bottle to produce the most-efficient CH_4 extraction conditions for CH_4 (ref. 45) as dissolved CH_4 is typically in lower abundance than CO_2 . Dissolved gases were transferred to pre-evacuated, weighed 21 stainless-steel canisters via headspace extraction.

Canisters that contained the winter and summer samples of dissolved gas were weighed to quantify the mass of dissolved gases collected and then balanced to 1 atm with ultrazero (C-free) air (AI UZ300 (Airgas)). The canister was then connected to a flow-through vacuum extraction line designed to extract sequentially CH₄ and CO₂ for ^{14}C analysis*6. As the sample gas is introduced to the vacuum line, (1) CO₂ is frozen out in a liquid nitrogen (LN) trap, (2) carbon monoxide is converted into CO₂ at 290 °C and frozen out in a second LN trap and (3) CH₄ is oxidized to CO₂ in a 975 °C furnace with cupric oxide pellets. CH₄-derived CO₂ and sample CO₂ were purified on the vacuum line, quantified manometrically and converted into graphite using the sealed-tube zinc-reduction method* 47 . Isotopic standards were extracted using the same methods to evaluate the procedural contamination of the sampling methods extraction-line system (see below).

Alongside the procedural and analytical standards and $^{14}\mathrm{C}$ -free blanks, which represented all sampling and processing steps (see below), the graphite was measured for its $^{14}\mathrm{C}/^{12}\mathrm{C}$ ratio with an accelerator mass spectrometer (AMS) at the W.M. Keck Carbon Cycle Accelerator Mass Spectrometer facility at UC Irvine 18 (equation (1) and Supplementary Table 2). For samples >0.2 mg C, an aliquot of the

 CH_4 -derived CO_2 or the sample CO_2 was analysed for $\delta^{13}C$ with isotope-ratio mass spectrometry (IRMS) (GasBench II coupled to a Delta plus IRMS (Thermo Fisher Scientific) (Supplementary Table 2):

$$\frac{^{14}\text{C}}{^{12}\text{C}} \bigg|_{sample, -2.5\%} = \frac{^{14}\text{C}}{^{12}\text{C}} \bigg|_{sample} \left(\frac{1 + -25/1,000}{1 + \delta/1,000} \right)^{2}$$
 (1)

$$FM = \frac{\frac{\frac{14_C}{12_C}}{s_{sample, -25\%, -}}}{0.95 \frac{14_C}{12_C}} \Big|_{OX1[-19\%,]}$$
 (2)

Radiocarbon values are reported in FM, which is the ^{14}C to ^{12}C ratio in the sample relative to that of the oxalic acid-1 standard (OX1) (equation (2)). The measured sample ratio is normalized to a $\delta^{13}\text{C}$ value of -25% to correct for the mass-dependent fractionation of ^{14}C (via measuring $\delta^{13}\text{C}$ simultaneously in the AMS (δ in equation (1)), divided by 0.95 times the activity of OX1 to normalize to the conventional pre-industrial wood standard in 1950, where the OX1 standard is corrected to its actual $\delta^{13}\text{C}$ value of -19% (ref. 49):

Mean ¹⁴C ages reported in YBP (equation (3)), which represents a ¹⁴C age calculated from the averaged FM values from equation (2):

14
C age(YBP) = -8,033 ln(FM) (3)

where 8,033 is the mean lifetime of ¹⁴C, in years, using the Libby half-life of 5,568 years. When calculating mean ¹⁴C ages, any FM values >1 (indicative of samples that contain 'bomb ¹⁴C' from post-1950 above-ground nuclear weapons testing) were replaced with 1 (calendar year 1950, FM of OX1) and then averaged across all the study lakes and within the general geology types.

We report $^{14}\!C$ ages, as opposed to calibrated-calendar ages, because dissolved CH4 and CO2 represent an open system that exchanges with various other C pools with presumably different $^{14}\!C$ ages within the lakes' C cycle. Calibrated-calendar ages only apply to C material in closed systems, in which the radioactive decay of $^{14}\!C$ is the only flux term. In our case the $^{14}\!C$ age serves as a tracer for the C source of the dissolved CH4 and CO2.

Validation of $^{14}\mathrm{C}$ results produced from the sampling methods. As mentioned above, we developed two methods for sampling dissolved CH₄ and CO₂ for C-isotope analysis in relatively high concentration below-ice waters (winter), and in low-concentration open waters (summer). To validate the isotopic data produced from these methods, we conduced laboratory tests to determine whether our methods introduced any measurement bias or extraneous C that would affect the true $^{14}\mathrm{C}$ and $^{13}\mathrm{C}$ signature of the sampled gases.

Tests of the winter method demonstrated minimal extraneous C and fractionation effects in both CO2 and CH4 for both 14C and 13C. The modern ¹⁴C blank was small and reproducible (~1.5 μg C and 2.5 μg C for CH₄ and CO₂, respectively (Supplementary Fig. 3)). This represents just 0.02% of the average extraction yields for both dissolved CH4 and CO2 in the winter samples, and had a negligible effect on the measured values after the 14C extraneous-mass correction. Additionally, we saw no effect from using the Nalgene PETE bottles, as their 14CH4 results were indistinguishable from those produced from headspace extractions using glass bottles. Likewise, the replicates of modern-C biogas lab standards (assessment of ¹⁴C-free C contamination), regardless of the sample size, yielded results within the range of 20 measurements of the biogas standards directly injected and combusted on the extraction line (Supplementary Fig. 3). To test the potential fractionation of 13C in CH4 and CO2, we also compared the 13C results from headspace extractions with those of direct injection and combustion. For the direct injection and combustion of CH₄, the δ^{13} C value was $-48.32 \pm 0.21\%$ (n=3) compared with $-48.37 \pm 0.07\%$ (n = 8) for the headspace extractions—a deviation comparable to the IRMS measurement error (~0.02‰). For the direct injection of CO₂, the δ^{13} C value was $-5.2 \pm 0.07\%$ (n = 3), comparable to $-5.3 \pm 0.48\%$ (n = 4) for the headspace extractions, which is also negligible.

We also tested the potential extraneous ^{14}C -free C contamination of the Liqui-Cel system (used for low-concentration open waters) (Supplementary Fig. 4). Similar systems using Liqui-Cel membranes have proved successful for minimal and reproducible ^{14}C blanks in marine settings, in which much greater volumes of water are degassed 50 . A recirculation system was built in the lab such that approximately 21 of ultrapure deionized water (brought to pH \approx 2 with dilute H₃PO₄) could be sparged with ultrahigh pressure (UHP) N₂ and flushed through the system to remove all the ambient gases and dissolved inorganic carbon (DIC) prior to the injection of modern biogas gas standards (CH₄ and CO₂). Similar to flushing with sample water in the field, the recirculating system was flushed with the N₂-sparged acidified water for 30 min, prior to the extraction of dissolved gases. After the flushing period, gas standards were injected into the recirculating water stream via a septa port and extracted through the Liqui-Cel membrane for 1 h (same duration as in the field sampling). Supplementary Fig. 4 shows the results from four replications of varying size for CH₄ and CO₂ relative

to the consensus values for the respective biogas standards. We determined the consistent addition of extraneous ^{14}C -free CO $_2$ over 1 h to be $25\pm7.5\,\mu\text{g}$, which is roughly 3% of the mean mass yield for open-water dissolved CO $_2$ samples. For CH $_4$, we determined a smaller extraneous ^{14}C -free C effect of $2\pm1\,\mu\text{g}$, which corresponds to approximately 2% of the mean mass yields for open-water dissolved CH $_4$ samples. We applied these mass corrections and associated errors to all ^{14}C data produced from the Liqui-Cel system. As all ^{14}C data are also normalized to $\delta^{13}\text{C} = -25\%$ during the AMS measurement (see above), any potential mass-dependent fractionation of the Liqui-Cel system or other sample-processing steps is reconciled in the final measurement and irrelevant for reported ^{14}C data.

Although we made considerable effort to mirror field sampling, the recirculation system in the lab does not replicate perfectly the open-system sampling in the field. During field sampling, water is not recirculated through the membrane and water filters, but is pumped out of the system and back into the lake, away from the intake. We believe this means our extraneous ¹⁴C mass correction is conservative and probably overestimated for both CH₄ and CO₂.

Regional mean 14 C ages for dissolved CH₄ and CO₂ emissions. We estimated the regional mean age of diffusive CH₄ and CO₂ (847 and 392 YBP, respectively) emissions using a lake-area-weighted mean. Specifically, the mean age for each gas in each geological unit was weighted by the proportional lake area in that unit to the total lake area.

Dissolved-gas concentration analysis. Methane and CO2 were analysed by flameionization detection using a Shimadzu GC-2014 gas chromatograph (Shimadzu) at the USGS Woods Hole Coastal and Marine Science Center. Prior to analysis, vials that contained the 20 ml water samples were brought to 1 atm by injecting UHP He through the vial septa. The vials were then overpressured slightly by the addition of 3.2 ml He-sparged, low-pH water. Reducing the pH to <2 transferred all the DIC species to the headspace as CO₂. After a 2h equilibration, 3.2 ml of the headspace was removed from the vial. Gas and water exchanges were achieved using Becton-Dickinson plastic syringes and 18-gauge needles (Becton, Dickinson and Co.) connected via a plastic three-way stopcock. The extracted headspace gas was injected into a 22 ml min⁻¹ He carrier gas through a gas-sampling valve, and CH₄ and CO₂ were separated at 80 °C on a 80/100 mesh HayeSep D (Hayes Separations) (5 m × 1/8 outside diameter) packed column. CO2 was analysed as CH4 after its reduction with a methanizer. Concentrations of CH₄ and CO₂ were determined against Scott Gas certified gas standards (Air Liquide) that spanned the range of observed values. Headspace CH₄ concentrations were converted into dissolved concentrations using a literature method⁵¹. Total DIC, or [DIC]_{Total}, measured in the headspace of the acidified samples, was converted into pCO₂ (or CO_{2ao}) for use in lake-air gas exchange calculations following the conventions of Stumm and Morgan⁵²:

$$\left[CO_{2_{aq}}\right] = \frac{\left[DIC\right]_{Total}}{1 + \left(\frac{K_{1}}{\left[H^{+}\right]}\right) + \left[K_{1}\frac{K_{2}}{\left[H^{+}\right]}\right]}$$
(4)

here [H⁺] is the hydrogen ion concentration based on lake pH and K_1 and K_2 are the lake-temperature-adjusted equilibrium constants for the dissociation of H_2CO_3 and HCO_3^- , respectively. CO_{2nq} is used as C_w in equation (5).

Sedimentary OC content. A volumetric sampler (747 cm³) was used to collect sediment from a stratigraphic section (69° 51′ 5.84" N 154° 51′ 48.26" W) of aeolian sand and silt that is representative of the permafrost and talik deposits underlying the lakes in these respective surficial geology units of the North Slope. This frozen sediment was cleared on a near vertical face and allowed to thaw just before sampling. To analyse % OC, we first removed soil carbonates by soaking 1 cm³ of dry sediment in a 10% HCl mixture overnight. We assumed that this removed all carbonate because: (1) a visual inspection of the untreated sediments determined the majority of inorganic C to be calcite (removed by 10% HCl at room temperature) and (2) % OC in HCl-treated samples was strongly positively correlated with the root biomass in the same samples (which means non-pedogenic carbonate was not a factor). Samples were then centrifuged, decanted and rinsed with deionized water until to reach a pH of 5.5. Acidified sediment samples were then analysed for C content on a C:N analyser (TruSpec (LECO) by analysing the products of sample combustion at 950 °C for CO₂ and using an infrared CO₂ detector at the Forest Soils Laboratory at the University of Alaska Fairbanks. We estimated the analytical precision as the s.d. of values based on two replicates of the National Institute of Standards and Technology Buffalo River Sediment standards per 40 samples. The total s.d. for all the standards was <0.02% OC.

Regional CH₄ and CO₂ lake–atmosphere diffusive flux. The fluxes (F) of dissolved CH₄ and CO₂ were calculated using a Fickian diffusion model:

$$F = k(C_{\mathbf{w}} - C_{\mathbf{a}}) \tag{5}$$

Where C_w is the concentration of either CH_4 or CO_2 in the water, C_a is the concentration of CH_4 or CO_2 in the surface water that is in equilibrium with the atmosphere and k is the water-to-air gas-exchange velocity. In an effort to constrain

the temporal variability, we collected three water samples for dissolved $\mathrm{CH_4}$ and $\mathrm{CO_2}$ concentrations over the course of approximately $2\,\mathrm{h}$ in the same location near the centre of each lake. In our flux calculation, C_w represents the mean of the three samples. Atmospheric background values of 1.91 ppm for $\mathrm{CH_4}$ and 400 ppm for $\mathrm{CO_2}$ were taken from the National Oceanic and Atmospheric Administration's Barrow, AK observatory Global Monitoring Division database, and used to calculate C_a . To determine k, we used the model of Cole and Caraco 53 , which empirically determined the relationship of k_{600} (cm hr $^{-1}$) and wind speed at $10\,\mathrm{m}$ (U_{10} (m s $^{-1}$)) to be:

$$k_{600} = 2.07 + 0.215U_{10}^{1.7}$$
 (6)

Once k_{600} is known, it is converted to k via:

$$k = \frac{k_{600}}{(600 / Sc)^{-0.5}} \tag{7}$$

Where Sc is the temperature-adjusted Schmidt number of either $\mathrm{CH_4}$ or $\mathrm{CO_2}$.

We assumed that all the diffusive fluxes of CH4 and CO2 occurred between ice breakup in the spring and freeze-up in the fall. In August of 2014, a subset of seven lakes within the glaciomarine, coastal plain, aeolian sand and aeolian silt geology categories were sampled for dissolved CH4 and CO2 at the surface. Daily fluxes were estimated for each lake for every ice-free day in 2014. For each lake, the ice-free period was determined as the cumulative number of days starting from the day before rapid warming was observed (indicative of ice break-up) and ending on the last day where daily average water temperature was above freezing (on average 122 d for the whole study region). This was determined from hourly water-temperature observations obtained by CALON (NSF Award no. 1107607) buoy monitoring stations. The temperature data were downloaded from the NSF Arctic Data Center (https://arcticdata.io/catalog/#data/page/0). Daily average water temperatures and wind speeds were also used to calculate the average solubility and gas-exchange velocities (k), respectively, for CH4 and CO2 during each day of the ice-free period. Historical daily average wind data for the ice-free period was downloaded for stations at Barrow, AK and Atqasuk, AK from the NOAA National Centers for Environmental Information web service (http://www.ncdc.noaa.gov/). Wind data from either Barrow or Atqasuk were used based on each lake's proximity to either weather station.

The August concentrations of CH $_4$ and CO $_2$, along with the lake pH measured at the time of sample collection, were applied to all ice-free days during the summer of 2014. This assumption is probably a source of error in our flux estimate. During the August survey, one lake (BRW 100) was replicated in time (measurements one week apart) and two others (BRW 130 and RDC 310) were replicated spatially (approximately 1 km apart on the lake). In both scenarios, the mean of the replicate concentration measurements was prescribed in the whole-summer flux calculations.

Winter (April 2014) dissolved-gas concentrations were calculated during the headspace equilibration technique (described above), in which the entire equilibrated headspace was collected and $\mathrm{CH_4}$ and $\mathrm{CO_2}$ were purified. Yields of $\mathrm{CH_4}$ and $\mathrm{CO_2}$ were measured manometrically using a calibrated baratron, and then used to determine the concentration of each gas in the original headspace. Headspace concentrations were then used with Henry's Law to determine the dissolved-gas concentration in each sample. As below-ice concentrations of dissolved $\mathrm{CH_4}$ and $\mathrm{CO_2}$ were typically much higher than during the ice-free August survey, it is likely that excess gas was emitted during ice breakup in the spring. Ice growth probably reaches a maximum depth in April.

Water-volume reduction from ice growth could explain 10-100% of the increased below-ice concentrations of dissolved CH₄ and CO₂ when compared with the concentrations in August. This effect was considered when estimating the rapid equilibration of dissolved gas with the atmosphere during the ice breakup in the spring (ice-out flux) from each lake. To estimate ice-out fluxes, we applied a concentration effect (based on the maximum ice thickness and lake volume) to August CH4 and CO2 concentration measurements. We then subtracted this concentration from the actual measured concentration below the ice in April. The difference was considered to be the CH₄ or CO₂ accumulation from sediment production and emission into the water during the ice-cover season. The accumulated mass was then divided by the number of days of ice cover in between when the ice first appeared on each lake in the autumn and the day that the belowice concentrations were measured. This value (grams per day) is an estimate of the integrated average accumulation rate below the ice. Next, this rate was multiplied by the total number of ice-cover days to estimate the total accumulation of CH4 and CO₂ below the ice in each lake. As this accumulation is conceived to be the excess dissolved CH₄ and CO₂ above the assumed open-water steady-state concentration measured in August, we interpret it as the total diffusive ice-out flux.

Including the estimate of ice-out fluxes, our regional average daily ice-free diffusive CH₄ flux was $6.2\pm3.4\,\mathrm{mg}\,\mathrm{CH_4}\,\mathrm{m^{-2}}\,\mathrm{d^{-1}}$. This estimate is within the range of pan-Arctic diffusive emissions from tundra-thaw lakes (mean 15.6 mg CH₄ m⁻² d⁻¹, range 0.5–90.1 mg CH₄ m⁻² d⁻¹, n = 23) (ref. 2). Our ice-out CH₄ fluxes ranged from 0 to 14% (n = 7) of total ice-free CH₄ diffusive flux, which is less than previous estimates from North Slope lakes ⁵⁴. The average daily ice-free diffusive CH₄ flux

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(excluding ice-out flux) was $5.9\pm0.1\,mg\,CH_4\,m^{-2}\,d^{-1}$, and closely resembles the average of $6.9\,mg\,CH_4\,m^{-2}\,d^{-1}$ of an open-water diffusion-only flux previously observed using similar methods for North Slope lakes 27 . Our mean daily diffusive CO $_2$ flux estimate of $2,620\pm2,240\,mg\,CO_2\,m^{-2}\,d^{-1}$ is on the high end of the range of CO $_2$ fluxes reported by a previous study of 25 North Slope lakes 35 .

Our data represent a minimum estimate for the total annual $\mathrm{CH_4}$ fluxes from Alaskan Arctic thaw lakes because we did not include ice-free ebullition or ice-bubble-storage emissions 36,56,57 . However, by measuring the diffusive $\mathrm{CH_4}$ flux in the centre of the lakes, where the water/atmosphere gas exchange velocity is probably higher than on the lake margins, the whole-lake diffusive flux of $\mathrm{CH_4}$ and $\mathrm{CO_5}$ may be slightly overestimated 18 .

Daily fluxes of $\mathrm{CH_4}$ and $\mathrm{CO_2}$ were calculated for each lake's ice-free period. The values were totalled and added to each lake's respective ice-out flux. This total value was treated as the annual diffusive flux for each lake.

All the lakes were sources of C to the atmosphere (regional total, $0.89\pm0.2\,\mathrm{Tg}\,\mathrm{C}\,\mathrm{yr}^{-1}$ (C=C-CO $_2+C$ -CH $_4$)). At the time of the flux measurement, one thaw lake, underlain by glaciomarine geology, was a sink for atmospheric CO $_2$ ($-42.6\pm0.7\,\mathrm{mg}\,\mathrm{C}$ -CO $_2\,\mathrm{m}^{-2}\,\mathrm{d}^{-1}$). However, high CH $_4$ emissions combined with the estimated ice-out flux of CO $_2$ from this lake were enough to outweigh the observed C sink, even when the sink was extrapolated to the whole ice-free season (117 d). Overall, this lake was an annual CO $_2$ and CH $_4$ source to the atmosphere of $1.39\pm0.04\,\mathrm{Mg}\,\mathrm{C}$ -CO $_2$ +C-CH $_4$. We assumed this behaviour was consistent with that of other thaw lakes in the glaciomarine category and applied fluxes accordingly when upscaling to the whole region.

A lake survey in 2014⁵⁹ estimated that approximately 85,000 lakes of area > 0.5 ha exist north of 68° N in Alaska. Using an ArcGIS shapefile (10,660 km²) generated from this report and geospatial analysis, we determined the total lake surface area within each geology category where ¹⁴C measurements were made. The total study area, including the land and lake area (231,157 $\rm km^2$), was determined by summating the areas of all general geology units contained within the lake survey⁵⁹. Annual areal fluxes were averaged for each geological unit surveyed during August 2014 (seven lakes within four geologic units). For the geological units not sampled in August (fluvial young, fluvial old and glacial young (14% of the total lake area in study)), annual diffusive fluxes were prescribed from observed units that had similar below-ice concentrations in April. For lakes within the observed geological units (81% of the total), the annual diffusive C-CH₄ and C-CO₂ fluxes were estimated by multiplying the average areal fluxes in each geological unit by its respective total lake area. For lakes outside the observed geological units (19% of the total), the mean of the areal fluxes from the observed units was multiplied by the total lake area in the unobserved geology. To estimate the total annual diffusive flux from the entire study region, fluxes from the observed and unobserved lakes were added and are shown in Table 1.

The total diffusive flux of CH_4 and CO_2 sourced from ancient C (fixed from the atmosphere $\geq 11,500\,\mathrm{YBP}$) was calculated by multiplying the mean fraction of the ancient C emissions (average of the possible contributions from 11.5 kYBP plus ^{14}C -free end members in the isotopic mass-balance model) for each geological unit by its respective total C flux. This gave the total ancient C flux (g) as both dissolved CH_4 and dissolved CO_2 for all the lakes in each geological unit. Similar to the total flux (described above), an estimate of the ancient C flux from lakes in the unobserved geological units was determined by multiplying the mean of the fraction of the ancient C from observed units by the estimated total C- CH_4 and C- CO_2 fluxes from the lakes in unobserved geology. This value was added to the total ancient flux from the lakes in observed units, and then divided by the total C flux (modern + ancient (for CH_4 and CO_2)) and is presented as the flux-weighted fraction of total CH_4 and CO_2 emissions sourced from ancient C (Table 1).

Five-source isotopic mass-balance model. IsoSource³⁷, an open-source Visual Basic software, was used to compute the range of possible contributions from five prescribed sources (f_A , f_B , f_C , f_D and f_E) to the mean FM value of dissolved CH₄ and CO₂ in each geology class:

$$FM_{S} = f_{AFM_{A}} + f_{BFM_{B}} + f_{CFM_{C}} + f_{DFM_{D}} + f_{EFM_{E}}$$

$$1 = f_{A} + f_{P} + f_{C} + f_{D} + f_{E}$$
(8)

where FM_S is the predicted solution to the mass-balance equation and f_A is the proportional source contribution from decaying C sequestered during the post-bomb period (1950–2012). For FM_A, we used the integrated annual average of atmospheric $^{14}\text{CO}_2$ from 1950–2012 from the Hua et al.⁵⁰ atmospheric record and extended it with the Barrow NOAA observatory record from X. Xu (personal communication) to give FM_A = 1.2211. Similarly, f_B is the proportional source contribution from decaying organic material of recent photosynthesis (calendar year 2013 atmospheric CO₂ FM_B value = 1.0313) (also from the Barrow NOAA observatory (X. Xu, personal communication), f_C represents the contribution from decaying 5,000 YBP organic C (FM_C = 0.5366), f_D represents decaying 11,500 YBP C (FM_D = 0.2389) and f_E represents 14 C-free 'also known as dead' C sources (FM_E = 0). As there are more than two unknowns in equation (8), which allows no unique solution, this model uses the principle of mass balance to compute iteratively multiple combinations of feasible source contributions in 5% increments $(f_A, f_B, f_C, f_D$ and f_E). A combination of source proportions is considered feasible

when the predicted solution (${\rm FM_s}$) falls within the 'tolerance value' range of the observed mean FM for each geological unit. The 'tolerance value' is equal to the standard error of the observed mean FM value for each geology class. Proportional contributions that fall outside the 10th and 90th percentile range of all computed solutions for a given source were considered unlikely and treated as outliers.

Geospatial extrapolation of CH₄ ages. In the simplest form of inverse distance weighting (Fig. 3), predictions are made at an unobserved location using a weighted sum of the observations, in which the weights are inversely proportional to the distance between the unobserved and observed locations. As the $^{14}\mathrm{CH_4}$ age observed at a given location is correlated with its geological substrate type, we also include a parameter that reduces the weights of observations with geology types different from that of the predicted location.

Taken together, we estimate the 14 CH₄ age, Z, at an unobserved location, x, with geology type, g, as a weighted sum of the K 14 CH₄ age observations, Z_k , at locations, x_k , with geology type, g_k , as:

$$Z(x) = \sum_{k=1}^{K} w_k Z_k / \sum_{k=1}^{K} w_k$$
 (9)

with weights, w_k :

$$w_k = |x - x_k|^{-\beta} / G \tag{10}$$

and

$$G = \begin{cases} 1 & \text{if } g = g_k \\ 20 & \text{if } g \neq g_k \end{cases}$$
 (11)

We use a typical value of β =2, to reduce sharp gradients in the interpolated product. The choice of G was somewhat arbitrary and was selected based on visual inspection of the final product. Predictions were made on a regular 1×1 km grid over the study area bounded by $68.24^{\circ}N - 71.66^{\circ}N$ and $159.13^{\circ}W - 147.77^{\circ}W$. We only retain predicted ages at a location if at least one observation has the same geology substrate type.

Although we cannot formally quantify the interpolation error for points without direct measurements, we can provide an estimate of the interpolation's prediction quality in terms of the pairwise distances from measured and predicted points. We define a quality of prediction (Q^p) at each predicted point as the effective number of measurements at a distance of 50 km that went into its interpolation (equation (12) and Supplementary Fig. 2, Equation 12).

$$Q^{P} = 50^{\beta} \sum_{k=1}^{K} w_{k}^{*}$$
 (12)

where w_k^* is calculated in the same as w_k in equation (10), but by forcing distances $|x-x_k|$ to take a minimum of 25 km. If this minimum distance was not applied, the Q^p of the predicted points that are in very close proximity to the measured points is much less meaningful.

Averaging and statistics. Where applicable (age of CH_4 versus CO_2 , ANOVA geology versus age for CH_4 and CO_2 , geospatial interpolation of CH_4 , end-member determination for isotopic mass balance for CH_4 and CO_2 , and summer 2014 spatial and temporal replicates), replicate samples (spatial or temporal) were averaged before the statistical tests were conducted. Supplementary Table 4 gives a detailed summary of the statistical results and analysis.

Data availability. Supplementary Information gives the relevant data that support the findings of this study but omits the atmospheric radiocarbon data (X. Xu, personal communication) used to extend the record published by Hua et al. (2013).

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