#### OPTICS

### Precise multispecies agricultural gas flux determined using broadband open-path dual-comb spectroscopy

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Advances in spectroscopy have the potential to improve our understanding of agricultural processes and associated trace gas emissions. We implement field-deployed, open-path dual-comb spectroscopy (DCS) for precise multispecies emissions estimation from livestock. With broad atmospheric dual-comb spectra, we interrogate upwind and downwind paths from pens containing approximately 300 head of cattle, providing time-resolved concentration enhancements and fluxes of CH<sub>4</sub>, NH<sub>3</sub>, CO<sub>2</sub>, and H<sub>2</sub>O. The methane fluxes determined from DCS data and fluxes obtained with a colocated closed-path cavity ring-down spectroscopy gas analyzer agree to within 6%. The NH<sub>3</sub> concentration retrievals have sensitivity of 10 parts per billion and yield corresponding NH3 fluxes with a statistical precision of 8% and low systematic uncertainty. Open-path DCS offers accurate multispecies agricultural gas flux quantification without external calibration and is easily extended to larger agricultural systems where point-sampling-based approaches are insufficient, presenting opportunities for field-scale biogeochemical studies and ecological monitoring.

#### INTRODUCTION

In the United States, methane (CH<sub>4</sub>) emissions from livestock (including enteric fermentation and manure management) are thought to be the largest source of anthropogenic  $CH_4$  emissions (1), with most of these emissions attributed to the beef and dairy industries. Precise estimation of livestock CH<sub>4</sub> emissions is challenging due to variability of management practices and cattle characteristics in commercial farms. Furthermore, in grazing systems, environmental drivers affect the forage quality (2), which, in turn, affects the enteric fermentation CH4 emissions but remain unaccounted for in national inventories (3, 4). Characterizing CH<sub>4</sub> flux from grazing systems is difficult as animals are unevenly distributed, limiting the efficacy of optical point sensor approaches (5). Cattle farms also emit considerable amounts of ammonia (NH<sub>3</sub>), a harmful aerosol-generating pollutant (6). Quantification of NH<sub>3</sub> emissions using traditional methods is challenging due to its adsorptivity (7-9). Here, we show that the dual-comb spectroscopy (DCS) technique is capable of precisely measuring these important emissions without large systematic biases.

Open path DCS is emerging as a powerful tool for determining greenhouse gas (GHG) emissions in the urban (10) and oil/gas (11) sectors. In DCS, the interference of two optical frequency combs generates extremely high-resolution, broadband spectra, with negligible instrument lineshape and a perfect frequency axis, while requiring no external calibration (12–14). Together, these properties improve the analysis of overlapping spectral features that appear in broadband atmospheric spectra and allow DCS to provide accurate path-averaged multispecies concentrations and temperature measurements

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(15). In addition, the high brightness and spatial coherence of comb sources enable precise spectroscopic measurements over kilometerscale paths. The precision achievable by DCS will lead to less uncertainty on livestock  $CH_4$  emission rates, thus improving the overall uncertainty of national-level enteric fermentation models (16–18).

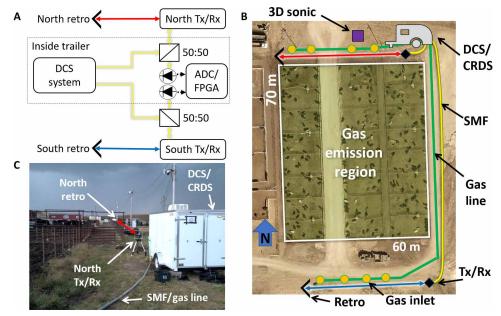
Here, we demonstrate DCS for multispecies (CH<sub>4</sub>, NH<sub>3</sub>, CO<sub>2</sub>, and H<sub>2</sub>O) quantification of gas emission flux from a small beef cattle feedlot and simultaneously validate the DCS system against a closed-path cavity ring-down spectroscopy (CRDS) gas analyzer. Measurements were performed between October 2019 to January 2020 and yielded over 10 days of CH<sub>4</sub> flux data for a field comparison of the two techniques. Fluxes are determined using an inverse Lagrangian dispersion model (IDM) that combines meteorological data with upwind and downwind concentrations from both the DCS and CRDS, and CH<sub>4</sub> fluxes from both systems agree to within model error. Our experimental design enables reliable benchmarking against a standard technique; however, the open-path DCS should allow for precise flux estimation in much larger pasture systems with sparser point sources. In addition, NH<sub>3</sub> emission rates from the feedlot are also determined using DCS with statistical precision of <10%, highlighting the versatility of broadband open-path laser spectroscopy for agricultural sensing.

#### **Dual-comb system**

The open-path DCS system (Fig. 1A) covers 35 THz from 1.4 to 1.7  $\mu$ m with fully coherent frequency combs that can resolve the atmospheric transmission across over 175,000 individual comb teeth. The system is designed to target multiple gas species with laboratory-level precision while operating in the field conditions of a cattle feedlot (Fig. 1, B and C). It is based on all-polarization–maintaining, semiconductor saturable absorber mirror (SESAM)–modelocked erbium-doped fiber lasers with repetition rates near 200 MHz. Mutual comb coherence is established by phase locking each comb to the same free-running 1560-nm external-cavity diode laser and by phase locking the carrier-envelope offset frequency ( $f_0$ ) of each comb using an in-line *f*-to-2*f* interferometer (19). In addition,

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**Fig. 1. Experimental setup.** (**A**) Schematic of the dual-comb spectrometer for feedlot gas concentration measurements on two optical paths. Yellow lines indicate singlemode fiber (SMF) transmitting and receiving dual-comb light from the north (red arrow) and south (blue arrow) open-air paths. Note: Displayed 50:50 beam splitters were fiber based. ADC/FPGA, analog-to-digital converter and field-programmable gate array. (**B**) Aerial image of Manhattan, Kansas feedlot. Approximation location of the trailer (gray) containing DCS and CRDS systems is marked as well as that of the three-dimensional (3D) sonic anemometer (purple square), transmitting/receiving telescope (Tx/Rx; black diamonds), retroreflectors (black chevrons), gas inlets for the CRDS system (orange circles) and sampling gas line (green lines), north open-air path (red arrow), south open-air path (blue arrow), and SMF for dual-comb transport (yellow lines). The gas emission region only included the animal pens with an area of 3731 m<sup>2</sup>. Photo credit: Riley County, Kansas. (**C**) Photograph of the north end of the site including the trailer housing both DCS and CRDS systems, the PVC tubing for south path SMF and gas line, Tx/Rx for the north path, and the north path retroreflector. Photo credit: Brian Washburn, NIST.

excess phase noise on the locks was subtracted in real time from the DCS interferogram signal using a field-programmable gate array (FPGA) (20, 21). The repetition rate difference (rate of interferograms recorded per second) was set to 208 Hz. To tailor the comb spectrum, light for each comb was amplified to ~1 nJ per pulse in an erbium-doped fiber amplifier and sent through a short (~3 cm) piece of highly nonlinear fiber. The 35-THz wide spectra were filtered with 25-nm-wide band-stop fibercoupled micro-optic filters centered near 1560 nm to block light without useful molecular absorption, maximizing achievable signal-to-noise ratio (SNR). The final DCS spectrum covered absorption features from CH<sub>4</sub>, CO<sub>2</sub>, NH<sub>3</sub>, and H<sub>2</sub>O (Fig. 2, A to D). For the DCS measurement, the filtered outputs were combined using a 50:50 fiber combiner generating two outputs that were directed over two open-air paths (Fig. 1A). Our DCS derives its concentration accuracy from high-resolution transmission molecular absorption database (HITRAN)-based (22, 23) fitting routines and its wavelength accuracy from a Global Positioning Systemdisciplined quartz oscillator (19). There is no need for field calibration.

#### **Measurement geometry**

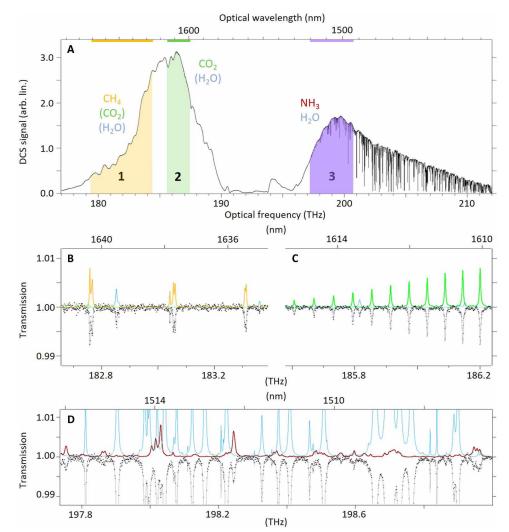
This work was performed at a Kansas State University beef cattle research unit outside of Manhattan, Kansas (Fig. 1, B and C). The 288 head of cattle at the site were contained in a pen measuring 70 m (north to south) by 60 m (east to west). Lasting from late October 2019 to early January 2020, the measurement captured gaseous emissions from both the cattle themselves (i.e.,  $CH_4$  from enteric fermentation) and area-distributed emissions (i.e.,  $CH_4$  and  $NH_3$  from manure management). The DCS measured two paths, north and south of the cattle pen, allowing both an upwind measurement (background) and a downwind measurement (enhancement). In the Manhattan area, prevailing

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winds from autumn to winter are northerly and southerly (fig. S1A). Temperatures at the site varied widely from  $-10^{\circ}$  to  $20^{\circ}$ C (fig. S1B). The site is surrounded by open, ungrazed pasture on all sides, providing stable background concentrations with values close to typical atmospheric background levels (5, 24, 25).

The DCS system was housed in a trailer parked on the feedlot's north side. A 10-m-long single-mode fiber (SMF) connected the first dual-comb output to the north telescope. The simple telescopes each consist of an ferrule connector/angled physical contact (FC/ APC) fiber termination followed by a collimating 179-mm focal length, 102-mm diameter, and 45° off-axis parabolic mirror. About 10 mW of eye-safe collimated dual-comb light was directed at a 5-cm-diameter retroreflector positioned 50 m away, and the reflected signal was recoupled back into the launch fiber with about 25% efficiency. The returned dual-comb light was attenuated to  $\leq 200$ µW and coupled onto a 150-MHz bandwidth InGaAs photodiode. A significant advantage of near-infrared (NIR) DCS is the ability to use fiber to probe open-air paths far from the comb sources. To reach the south path, the dual-comb light was transported both ways through a 200-m-long duplexed SMF. Both telescopes were mounted on automatic gimbals that were realigned remotely using coaligned silicon charge-coupled device cameras. Each open-air path has slight height variations along its 50-m distance, ranging from 1.5 to 2.0 m above ground, which is included in the flux-estimation model described in Materials and Methods.

For each path, the InGaAs photodiode signal was low-pass filtered at 100 MHz and then digitized and phase-corrected in real time on an FPGA (20, 21). In addition to these two DCS signals, inputs to the FPGA include the four phase-locked frequencies for



**Fig. 2. Broadband, high-resolution DCS spectra taken at the downwind edge of the feedlot.** (**A**) Full DCS spectrum at 5-min averaging time with highlighted sections showing the three spectral bands of interest (1, 2, and 3). Absorbing molecules are indicated each band with weak, interfering species shown in parentheses. (**B**) Example subsection of band 1. DCS data are shown in black with a fit to a HITRAN model in gray. The inverted axis shows transmission models for each individual species—CH<sub>4</sub> in yellow, H<sub>2</sub>O in blue, CO<sub>2</sub> in green, and NH<sub>3</sub> in maroon. (**C**) Example subsection of band 2 with CO<sub>2</sub> and weak H<sub>2</sub>O. (**D**) A subsection of band 3 highlighting the benefit of high resolution and large bandwidth, allowing retrieval of weak NH<sub>3</sub> in a strong interfering H<sub>2</sub>O background. Note that, while DCS data in (B) to (D) are down-sampled to 1-GHz resolution for clear visualization, all fitting is done at the native resolution (200 MHz). Models shown here are for a 100-m round-trip path and 3.04 parts per million (ppm) CH<sub>4</sub>, 452 ppm CO<sub>2</sub>, 0.57% H<sub>2</sub>O, and 1.23 ppm NH<sub>3</sub>.

stabilizing the two combs (i.e., the two optical beat notes and two carrier-envelope offset frequencies), the two comb repetition rates, and an external 10-MHz clock. The real-time correction algorithm removes both phase and timing jitter in the interferograms and co-adds them to yield a single spectrum every 5 min. In addition, a three-dimensional sonic anemometer was positioned on a tower near the north path at approximately 3.5 m above the ground to record wind information every 100 ms.

#### RESULTS

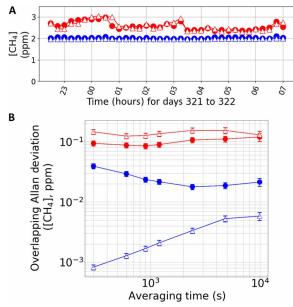
#### DCS spectra and methane concentration retrievals

The DCS spectrum acquired at the feedlot over the standard 5-min integration time resolves hundreds of narrow absorption features over its 35-THz bandwidth, the broadest spectrum ever captured using atmospheric open-path DCS (Fig. 2A). The absorption from

CH<sub>4</sub>, CO<sub>2</sub>, and H<sub>2</sub>O below 190 THz is weak for these short 100-m round-trip optical path lengths, but one can observe the small percentlevel absorption lines in zoomed-in spectra (Fig. 2, B and C). This small absorption provides enough signal to retrieve reliable concentrations with DCS. Above 198 THz, the water absorption becomes stronger and visible in the unexpanded spectrum. Underneath this strong water absorption are multiple weak NH<sub>3</sub> absorption features (Fig. 2D). Our ability to retrieve NH<sub>3</sub> concentrations amid this forest of strong water lines is evidence of the benefits of the bandwidth, resolution, and low spectral distortion possible with DCS. The total spectrum consists of over 175,000 spectral elements at 200-MHz point spacing (i.e., over 35 THz of optical bandwidth). The DCS figure-of-merit, defined as the product of the SNR and number of spectral elements, is in excess of  $1.5 \times 10^7$  for a 5-min average, comparable to laboratory-based DCS systems (12).

Clear enhancements are visible in the time series of measured CH<sub>4</sub> concentrations from the DCS and CRDS systems for over 8 hours on the night of 17 November 2019 (Fig. 3A). Similar concentration time series are retrieved for NH3 as discussed below and for H<sub>2</sub>O and CO<sub>2</sub> as shown in the Supplementary Materials (fig. S2, A and B). CH<sub>4</sub> concentrations are averaged to 15-min time resolution, the minimum time over which our flux calculation is taken to be valid (8, 26–28). Typically,  $CH_4$  downwind enhancements with cattle present were 600 parts per billion (ppb) above the ~2 parts per million (ppm) background but could exceed 1 ppm during less windy periods. CH<sub>4</sub> concentrations from the two sensors and both paths compare well within the 25-ppb DCS experimental measurement precision estimated from the Allan-Werle deviations (29) of the upwind data (Fig. 3B). Allan-Werle deviations generalize the notion of measurement instability with each point signifying the measurement instability over a given averaging period. The CH<sub>4</sub> DCS precision at 900 s is 1.25 ppm·m (path-averaged concentration precision of 25 ppb), which matches the 1 to 3 ppm·m precision reported previously (15). Using the same method, the CRDS precision at 900 s was estimated to be ~2 ppb. An upward slope visible on the CRDS upwind Allan-Werle deviation (Fig. 3B) is driven by background CH<sub>4</sub> variability.

By this measure, the CRDS is an order of magnitude more precise than the DCS on the background (upwind) channel. However, this higher instrument precision ignores the added sampling uncertainty associated with intermittent point sensing compared to continuous open-path sensing. The strength of DCS is seen in the downwind channel, where DCS provides a more precise measure of gas concentration than CRDS (Fig. 3B) despite having higher



**Fig. 3. Upwind and downwind CH**<sub>4</sub> **concentrations and associated instabilities.** (**A**) Time series of DCS (closed circle) and CRDS (open triangles) measured north (red) and south (blue) dry concentrations of CH<sub>4</sub>. (**B**) Allan-Werle analysis of CH<sub>4</sub> concentrations calculated using all data displayed in the above time series; upwind DCS (blue circles), downwind DCS (red circles), upwind CRDS (blue triangle), and downwind CRDS (red triangles). Note that the instability of the upwind concentrations is lower for the CRDS. For the downwind case, the DCS data show lower instability.

instrument uncertainty. With only four gas inlets along each path and less than 50% uptime on either path for one 5-min measurement cycle, the CRDS is more susceptible to stochastic  $CH_4$  plume variability than is the path-averaged and continuous dual-channel DCS sensor. In this experiment, the benefit in precision provided by continuous and path-averaged sampling is as large as 20 to 40 ppb (calculated as the difference in Allan-Werle deviations at 900 s for downwind DCS and CRDS), comparable to the background statistical precision of the DCS sensor of 25 ppb.

In this experiment, the homogeneous feedlot source provided a near ideal plume geometry for emissions quantification and yet the point sensor system still had decreased downwind precision due to insufficient temporal and spatial sampling. In a pasture system, where multiple, dispersed point sources create nonuniform plumes, a continuous integrated-path measurement will provide much larger improvements in precision over a multiport sampling system connected to a point sensor.

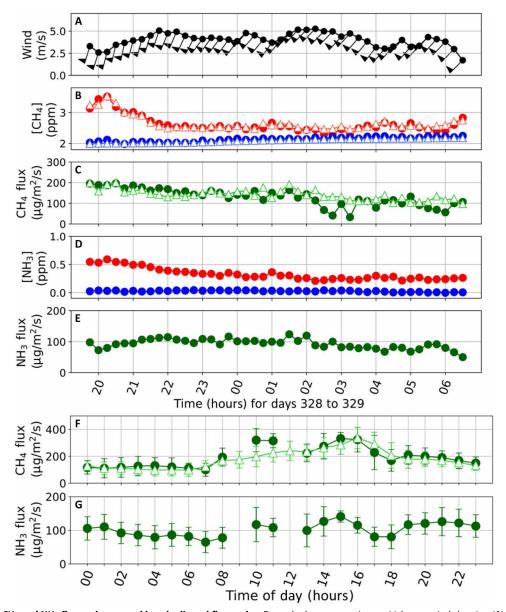
#### **Methane flux**

We examine an 11-hour period during the night of 24 November 2019 with appropriate weather conditions for flux retrievals with our IDM (see Materials and Methods) and complete coverage by both the DCS and CRDS systems (Fig. 4, A to E). The CH<sub>4</sub> concentrations are given for both the upwind and downwind paths from both the DCS and CRDS systems (Fig. 4B). In addition, the CH<sub>4</sub> flux from both the DCS and CRDS data is shown with the CH<sub>4</sub> flux from the feedlot showing clear time dependence on the hour time scale (Fig. 4, C and F). These changes are easily quantifiable with the 5-min resolution of our sensors and the averaged 15-min resolution of the flux calculation. The DCS and CRDS measurements yield similar time-dependent CH<sub>4</sub> fluxes from the feedlot with values ranging from 100 to 200  $\mu$ g/m<sup>2</sup> per s. The CH<sub>4</sub> flux does show some disagreement during a period of small enhancement after 2:00 a.m. when winds were fast and near the edge of acceptable directions (Fig. 4C).

To compare the flux retrieved from the DCS and CRDS, we examine the correlation between values measured simultaneously with both sensors throughout the 4-month measurement campaign (Fig. 5). We fit a linear slope to this correlation by splitting the data into two groups: days with cattle present (day 305 to day 346) and days without cattle (day 347 to day 355). Even without cattle present, there is a baseline level of methanogenic bacterial activity in the feedlot manure, leading to CH4 flux values with an average of  $18 \pm 11 \,\mu\text{g/m}^2$  per s. The intercept of the linear regression of the days without cattle (i.e., small flux measurements) is used as the intercept for a linear fit to the entire flux dataset. The intercept is calculated to be 1.8  $\mu$ g/m<sup>2</sup> per s (2% of typical CH<sub>4</sub> flux) and the slope is found to be 1.06, signifying a 6% bias between DCS and CRDS flux estimates. This close agreement between DCS and CRDS flux values was achieved without calibration of the DCS instrument as is required for continuous-wave (CW) laser sensors measuring comparable path-integrated concentrations (~100 ppm·m) (30). The demonstrated ability of DCS to measure CH<sub>4</sub> flux accurately without intensive calibration and on multiple remote fiber-connected paths enables wider deployment of DCS systems for CH4 emissions inventory development and mitigation efforts.

#### Ammonia concentrations and flux

The same DCS instrument that allows for accurate, calibration-free quantification of feedlot  $CH_4$  emissions simultaneously provides



Downloaded from https://www.science.org at Kansas State University Manhattan on September 18, 2023

**Fig. 4. Time-resolved CH**<sub>4</sub> and **NH**<sub>3</sub> **flux and averaged hourly diurnal flux cycles.** Example dataset covering an 11-hour period showing (**A**) wind conditions at the measurement site, (**B**) CH<sub>4</sub> concentrations (averaged to 15-min time resolution) retrieved from the DCS (solid circles) and CRDS (open triangles) systems for north (red) and south (blue) paths, (**C**) the corresponding CH<sub>4</sub> flux retrieved from these DCS and CRDS measurements, (**D**) NH<sub>3</sub> concentrations from the DCS (solid circles) and CRDS (solid circles) and CRDS (solid circles) and CRDS (solid circles) and **C** (**B**) the corresponding NH<sub>3</sub> flux. The wind barbs point to the direction from which the wind is coming. (**F**) Diurnal cycle of CH<sub>4</sub> flux determined by DCS (solid circles) and CRDS (open triangles) when cattle were at the site (October 2019 to December 2019). Error bars are calculated by taking the SD of all 15-min averages included in each time bin. The increase in CH<sub>4</sub> flux between hours 8 and 16 is due to increased enteric fermentation after cattle feeding. (**G**) Diurnal cycle of NH<sub>3</sub> flux determined by DCS.

precise time-resolved NH<sub>3</sub> concentrations upwind and downwind of the feedlot (Fig. 4D). The average NH<sub>3</sub> background concentration was 60 ppb, equivalent to background feedlot NH<sub>3</sub> levels reported in the literature (24) but above standard atmospheric levels of 4 ppb (25). This elevated background is likely due to the proximity of the open-path sensors to the emission area. The average NH<sub>3</sub> enhancement was 430 ppb over background with some enhancements up to 1 ppm. An Allan-Werle deviation of the NH<sub>3</sub> background gives a precision of about ~10 ppb or 0.5 ppm·m at 900-s averaging time. The first demonstration of open-path DCS captured NH<sub>3</sub> absorption signatures with a beam passing over an open bottle of NH<sub>3</sub> (31). We return to these roots by demonstrating the first coherent, high resolution, open-path DCS detection of NH<sub>3</sub> that enables quantification of feedlot NH<sub>3</sub> flux with precision rivaling commercial sensors (8, 32) while also providing vital CH<sub>4</sub> flux.

Using the same IDM as for CH<sub>4</sub>, NH<sub>3</sub> fluxes were calculated at 15-min intervals (Fig. 4E). The fractional uncertainty in NH<sub>3</sub> flux measurement due to DCS instrument error alone is 3.5% for the average enhancement of 430 ppb (see Materials and Methods). The Allan-Werle deviation can also be applied directly to flux time series and results in a statistical precision at 900 s of 8  $\mu$ g/m<sup>2</sup> per s (8% of average NH<sub>3</sub> flux). This analysis of instrument precision ignores

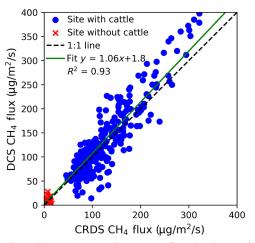


Fig. 5. Correlation between DCS and CRDS CH<sub>4</sub> flux. The data are fit to a line, determining the vertical intercept using fluxes without cattle (red x), and the slope was determined using all data. This process demonstrates 6% overall agreement between the DCS and CRDS CH<sub>4</sub> flux with a background offset of ~2  $\mu$ g/m<sup>2</sup> per s (~2% of usual flux with cattle present).

potential biases from baseline distortion, detector nonlinearity, and cross-talk in the spectral model used to fit NH<sub>3</sub> and neighboring H<sub>2</sub>O absorption features centered at 1510 nm (Fig. 2D). The uncertainty due to cross-talk is estimated at <5% (see the Supplementary Materials). Detector nonlinearity was not a large issue in this experiment as the received light was highly attenuated and no deep absorption lines were used in the analysis. The cepstral-domain fitting technique implemented in this work (see Materials and Methods) has been shown to be less sensitive to baseline fluctuations (*33*). Still, some bias in NH<sub>3</sub> concentration due to the choice of cepstral-domain filter function remains at a level comparable to the reported statistical precision (<5%). The combined uncertainty due to the effects discussed here is <10%, smaller than the ~20% disagreement found in previous comparisons of NH<sub>3</sub> flux estimation methods (*8, 9*).

#### Diurnal cycles of methane and ammonia

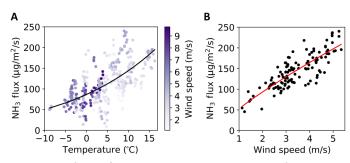
The gas emission rate from the feedlot (and from agricultural systems in general) fluctuates over time, and thus, continuous measurement over a variety of conditions is necessary for complete understanding of these emission sources. Diurnal cycles for both CH<sub>4</sub> and NH<sub>3</sub> fluxes from the feedlot were generated by binning individual 15-min flux averages by hour of day for days when cattle were present (Fig. 4, F and G). In total, DCS data from 12 days are included in the diurnal cycle analysis, which amounted to 341 DCS flux calculations or an average of 14 DCS flux measurements per bin. A DCS flux average is only shown when the hour bin contains three or more 15-min averages (Fig. 4, F and G). The diurnal cycles with cattle present measured by DCS and CRDS match within statistical error bars. The morning hours are not as well covered by the DCS system as rapid temperature shifts and frosting on optical components made telescope alignment more challenging. Ruggedized telescopes developed for DCS oil and gas research will be incorporated in the future to mitigate this issue (34). The DCS itself operated robustly for the duration of the field campaign, breaking phase locks only a handful of times over the 3 months in the field.

A clear diurnal cycle in  $CH_4$  production from the feedlot is observed with increased  $CH_4$  fluxes during daylight hours (Fig. 4F). An increase in CH<sub>4</sub> appears after morning and afternoon feeding times (6 a.m. to 7 a.m. and 1 p.m. to 2 p.m.), suggesting that the source of the CH<sub>4</sub> emissions originates from increased cattle digestion and associated enteric fermentation (4, 35). No such trend is seen in hourly binned data when the cattle were not present, although microbial activity in the manure still produces a small CH4 flux. The nighttime CH<sub>4</sub> flux stabilizes as the cattle sleep, and the rate of enteric fermentation slows down considerably. The average DCS CH<sub>4</sub> flux during the presence of cattle (155  $\pm$  85 µg/m<sup>2</sup> per s) minus the manure contribution (18  $\pm$  11  $\mu$ g/m<sup>2</sup> per s) gives an average cattle  $CH_4$  flux of 137 ± 86 µg/m<sup>2</sup> per s. This number compares well with the Intergovernmental Panel on Climate Change (IPCC) 2006 (18) guideline number for beef cattle CH<sub>4</sub> emissions normalized to our feedlot size (~135  $\mu$ g/m<sup>2</sup> per s), although every agricultural system is slightly different and deviations from this value are to be expected depending on cattle feed and manure management techniques.

For time periods with good data coverage (all times but 9 a.m. to 12 p.m.), the diurnal cycle for NH<sub>3</sub> (Fig. 4G) shows less variation than that of CH<sub>4</sub>. The NH<sub>3</sub> diurnal cycle shows a more constant daily flux with an average of  $104 \pm 39 \,\mu\text{g/m}^2$  per s or 116 g per head per day. This average compares well to literature values from measurements conducted in the central United States at concentrated dairy/beef cattle feeding operations during similar times of the year (36-38). For instance, the mean per capita emission rates of NH<sub>3</sub> during autumn months at two Texas panhandle beef cattle feedyards were 122 g per head per day and 83 g per head per day, measured using a single open-path CW laser sensor. The overall range of NH<sub>3</sub> emission rates from the same feedyards varied between 31 g per head per day in January and 207 g per head per day in October (37). All the NH<sub>3</sub> fluxes measured with cattle present at our Kansas test site fall within this range of values (Fig. 6A). NH<sub>3</sub> does not originate from digestive processes, rather it originates from hydrolysis of urea in the manure deposited on the ground in the feedlot pens and the emission rate fluctuates slightly over the course of the day, which has been observed in other feedlots as well (39). The lack of a clear pattern is attributed to the many factors that must be considered when studying the rate of hydrolysis of urea and subsequent volatilization of gaseous NH<sub>3</sub>. It is known that temperature, soil water content, soil pH, and wind conditions can all modulate the rate of NH<sub>3</sub> release from agricultural soils (40). It is also known that differences in the variety of bacteria in soil can alter the dependences of any given soil ecosystem to the environmental factors (41).

#### Ammonia flux dependence on temperature and wind

Our open-path DCS measurement reveals the dependence of NH<sub>3</sub> flux on temperature and wind speed (Fig. 6). Assuming constant pH, soil temperature, total ammoniacal N in solution, and mass transport coefficient, the volatilization of NH<sub>3</sub> should generally follow a functional form proportional to Henry's volatility constant ( $K_h$ ) for ammonia-water solution at a given temperature (40, 42). This form can be expressed (40) as  $K_h = (A/T)10^{6.123 - 1825/T}$ , where A is a proportionality coefficient and T is the ambient air temperature in kelvin. A fit to this function is applied to the estimated NH<sub>3</sub> fluxes with an  $R^2$  value of 0.36 (Fig. 6A), although it should be noted that a linear fit of the data provides a similar  $R^2$  value. The fit conveys the general increase in volatilization as a function of ambient air temperature, which has been demonstrated previously (43, 44). Factors such as microbial activity (41), manure pH (40), freeze-thaw cycles (45), and winds (40) contribute to large deviations from the Henry



**Fig. 6. Dependence of NH**<sub>3</sub> **emission rate on environmental parameters.** (**A**) NH<sub>3</sub> flux (15-min averages) versus ambient air temperature. Color indicates 15-min averaged wind speed (*U*) for given flux estimate. Black line represents fit ( $R^2 = 0.36$ ) to functional form for Henry's volatility constant (40). Note the large deviations of flux values near 0°C corresponding to complicated dynamics associated with freeze-thaw cycles. (**B**) NH<sub>3</sub> flux (15-min averages; black dots) versus *U* for ambient air temperature greater than 7°C. Red line represents fit ( $R^2 = 0.65$ ) to power law  $F = AU^{\beta}$  with  $A = 56.1 \, \mu g/m^2$  per s and B = 0.77.

model. Microbial activity and manure pH were not measured but can reasonably be taken to vary on seasonal time scales (43). Evidence of complicated freeze-thaw dynamics is apparent in our single season dataset, with a large spread of reported flux estimates in the 0° to 5°C range, just above the freezing point of water. For fixed temperatures above the freezing point and fixed surface characteristic lengths, modeling shows (40) that volatilization scales nearly linearly with average wind speed, U. For temperatures above 7°C, a power law,  $F = AU^{B}$ , can be reliably fit ( $R^{2} = 0.65$ ) to the NH<sub>3</sub> flux data (Fig. 6B) yielding B = 0.77. This result falls very close to the literature value (40) of 0.8, good evidence of wind-dependent emission rates of NH<sub>3</sub> from the feedlot. The large dependence of NH<sub>3</sub> volatilization on environmental parameters stresses the importance of extended continuous field measurements such as those provided by calibration-free open-path DCS. For example, our results on the wind dependence of NH<sub>3</sub> emission rate will inform future studies aimed at reducing NH<sub>3</sub> emissions using modern management practices such as restricted grazing (46), targeted manure application (47), and agricultural windbreaks (48).

#### DISCUSSION

In this work, we demonstrate the advantages of broadband, highresolution laser sensing by using coherent, open-path DCS for agricultural gas flux quantification for the first time at a small beef cattle feedlot. The large DCS bandwidth covered absorption from four different molecular species: CH<sub>4</sub>, NH<sub>3</sub>, CO<sub>2</sub>, and H<sub>2</sub>O. We specifically target the CH<sub>4</sub> and NH<sub>3</sub> emissions, which are the most important for this agricultural system. DCS simultaneously achieves sub-parts per million-meter detection sensitivity for NH3 and parts per million-meterlevel sensitivity for CH<sub>4</sub>. Note that without the high resolution offered by our fully coherent technique, broadband sensing for NH3 in this convenient band (located next to the useful telecom C-band) would be next to impossible due to H<sub>2</sub>O clutter (Fig. 2D). Furthermore, the DCS is configured to measure across two displaced open-air paths using fiber-coupled telescopes. In this way, we continuously monitor the concentration over widely separated upwind and downwind open paths, which then allows for accurate flux estimation based on the directly observed concentration enhancement. We find the openpath configuration of the DCS captures downwind enhancements

due to the gas emission with higher precision than a standard closedpath technique for certain wind conditions. When input to an IDM model, the upwind/downwind DCS data yield a CH<sub>4</sub> flux for the cattle feedlot that agrees to within 6% of the flux estimated by a colocated closed-path CRDS system, which is well within the 10% uncertainty attributed to flux models of this type (28). This agreement against a standard agricultural measurement technique gives us confidence that DCS accurately quantifies gas flux in an agricultural context. Because of the length of tubing required to transverse the feedlot site, a double path measurement of NH<sub>3</sub> using CRDS cannot easily provide a reliable benchmark. Yet, the retrieved NH<sub>3</sub> flux estimate from the DCS data generally agrees with the literature in terms of absolute magnitude and dependence on environmental parameters (Fig. 6).

A major motivation for this work is that the DCS system can be extended to estimate emissions from much larger areas. To this end, we briefly consider the requirements for estimating CH<sub>4</sub> flux from a 500 × 500 m pasture containing 40 cattle. When our values are scaled to 500-m paths, the achievable DCS precision at 900 s should be around 2 ppb, in line with previous NIR DCS demonstrations (15). Assuming a standard box model for the cattle emissions (49), we can scale the average CH<sub>4</sub> enhancement ( $E = C_{sig} - C_{bkg}$ ) measured in our feedlot to a possible pasture enhancement (E') using the following relation

$$E' = E \frac{wN'}{w'N} \tag{1}$$

Note that *w* is the feedlot width (60 m), *w'* is the pasture width (500 m), *N* is the number of cattle in the feedlot (288 head), and *N'* is the number of cattle in the pasture (40 head). Equation 1 assumes that *w'* is less than the average horizontal wind speed times the measurement integration period. This assumption should be satisfied for *w'* = 500 m and a 15-min integration time. Using Eq. 1, the enhancement on the downwind edge of the 500 × 500 m would be, on average, around 10 ppb. By averaging fluxes, this enhancement will yield a CH<sub>4</sub> flux uncertainty of 10% after ~2.25 hours. For GHG inventories, one would like to measure weekly or monthly averaged emission with >10% flux uncertainty (*3*, *17*), which is easily supported at this time resolution. Subdividing the pasture with additional beam paths could greatly reduce averaging times if higher time resolution is required.

Looking toward the future, the open-path advantage of DCS motivates future pasture-scale flux estimation. As discussed above, the same approach used here should be applicable to CH<sub>4</sub> and NH<sub>3</sub> emissions from larger areas and will improve efforts to accurately quantify livestock and other agricultural contributions to GHG inventories. Open-path alternatives to standard techniques are especially advantageous for NH3 detection given that the "sticky" and reactive nature of NH3 demands difficult calibration of extractive NH<sub>3</sub> analyzers. Here, we have shown that DCS is a viable solution for sub-parts-per-billion level sensing of NH3 over kilometer scales in a system that simultaneously provides information about multiple other gaseous species with precision comparable to single-species open-path sensors (8, 50, 51). The DCS NH<sub>3</sub> sensing has already provided useful in situ data regarding the wind dependence of NH<sub>3</sub> volatilization rates, simultaneously benchmarking biogeochemical models and encouraging further emissions mitigation research (40, 47). In the future, multispecies DCS sensing will help determine accurate environmental dependences of CH4-NH3 and CO2-NH3 emission

factor ratios, ultimately improving our understanding of microbial activity and carbon exchange in feedlot and grassland ecosystems (43, 52). While the current system operated in the NIR, continued advances of DCS further into the mid-IR provides opportunities for the flux quantification of a greater number of gasses and with greater sensitivity. In particular, the 2.0- to 2.4-µm spectral band presents increased sensitivity to CO<sub>2</sub>, CH<sub>4</sub>, and NH<sub>3</sub> and is accessed using photonic waveguides (53, 54). In addition, many groups have recently demonstrated advances in mid-IR DCS sensing (55-61). The functional group region (3 to  $5 \mu m$ ) includes atmospheric transmission windows with access to strong CH<sub>4</sub>, CO<sub>2</sub>, and N<sub>2</sub>O absorption. Precision N2O emissions measurements are particularly interesting for the atmospheric sensing community as N<sub>2</sub>O remains an understudied portion of global agricultural GHG emissions and a threat to the stratospheric O<sub>3</sub> layer (62). Field-scale DCS flux measurements covering multiple nitrogen-containing species (i.e., NH<sub>3</sub> and N<sub>2</sub>O) will enable improved benchmarking of soil biogeochemical models (63). The mid-IR can also be used for sensing of biogenic volatile organic compounds and O<sub>3</sub>, enabling advanced monitoring of plant health and agricultural aerosol production (64). As part of the larger vision of "precision agriculture," the frequency comb offers precise gas fluxes for many species simultaneously over large spatial scales, which will one day enable sustainable and more productive farming.

#### MATERIALS AND METHODS

#### **CRDS** setup

The DCS approach was also validated against a more traditional CRDS measurement of CH<sub>4</sub>, CO<sub>2</sub>, and H<sub>2</sub>O performed using a commercial trace gas analyzer (G2311-f, Picarro), which was housed in the same trailer as the DCS system. Before the field deployment, the CRDS analyzer underwent a multipoint calibration using primary CH4 and CO2 World Meteorological Organization calibration standards (Global Monitoring Laboratory, NOAA, Boulder). At the measurement site, the CRDS analyzer was connected to a custom-built gas manifold. Four air inlets were deployed at the north edge of the feedlot, and another four air intakes were set up at the south edge of the feedlot. Each air intake consisted of a 1-m stainless steel tube (0.43-cm inner diameter) with a rain diverter and mesh screen in one of its extremities. The other extremity of the tube was connected to a stainless steel filter (7-µm sintered element filter). To prevent condensation, the filter holder was heated using a 0.5-W heater connected to a 12-V DC power supply, and a critical flow orifice located downstream of the filter was used to reduce the air pressure in the intake line and to ensure similar flow rate at all intakes. A polyethylene/aluminum tube (0.43-cm inner diameter) draws air from the intakes to the custom-made manifold.

The manifold was used to control the air flow from air intakes to the CRDS gas analyzer. The manifold switched between north and south air intakes every 30 s. The air was drawn continuously through all air intakes at a flow rate of approximately 1900 cm<sup>3</sup> min<sup>-1</sup> using a diaphragm vacuum pump. A sample of the total flow was directed to the CRDS analyzer at a flow rate of 300 cm<sup>3</sup> min<sup>-1</sup>. All gas transported to the CRDS sample cell is heated to 60°C before measurement, and the CRDS only reports concentrations when its cell temperature is stable. Certified calibration tanks were used to verify the CRDS measurements every 6 hours. Concentrations measured by the CRDS gas analyzer were recorded at a rate of 10 Hz, and north and south paths data were averaged every 30 s. The first 15 s of data after switching intakes is discarded to ensure that the flushing of the sampling line is not included in the averaged measurement period.

#### Micrometeorological techniques and flux modeling

Gas emission flux is determined using an IDM (27) using the measured upwind and downwind concentrations combined with appropriate wind statistics as inputs. IDM is a well-established micrometeorological method to determine scalar exchange from well-defined source areas. This model is particularly adept at quantifying gas emissions from source areas with well-defined boundaries. The IDM uses the rise of concentration downwind from the source and wind statistics to determine the source emission rate. Numerous validation studies have been conducted under field conditions by releasing a tracer gas at a known flow rate and estimating the recovery rate with the IDM (27, 28, 65–67). These studies have reported an emission rate accuracy of  $\pm 10\%$ . A freely available IDM software, WindTrax (27), was used for these dispersion simulations.

The IDM approach requires appropriate weather conditions to calculate reliable gas flux results, and data were filtered based on the following criteria. As WindTrax is only valid on 15-min or longer time scales, we averaged the 5-min raw concentration data to 15 min (900 s) (8, 27). For our beam layout, wind direction ( $\theta$ ) was required to be northerly or southerly  $(315^\circ < \theta < 45^\circ \text{ or } 135^\circ < \theta < 225^\circ)$ . Acceptance criteria for friction velocity  $(u^*)$  and Monin-Obukhov Length (*L*) were set at  $u^* > 0.1$  m/s and |L| > 10 m/s (68). The weather statistics at the site satisfied these criteria 60% of the total measurement time. The site wind conditions, temperature, and precipitation records are available for all measurements (fig. S1). The gas emission region (Fig. 2B) used by the IDM included only the cattle pens consisting of an area of  $3731 \text{ m}^2$  (the road in between the pens was not included in the emission region). In WindTrax, both the DCS and CRDS north/south path concentration measurements were modeled as line concentration sensors with 30 points, starting at the telescope and ending at the retroreflector.

One of the principal sources of uncertainty in the IDM arises from the uncertainty in the concentration measurements themselves, either from the DCS instrument or CRDS instrument. The resulting fractional uncertainty in the flux can be estimated from the following

$$\frac{\sigma_F}{F} \sim \frac{\sqrt{2} \,\sigma_{C,\text{bkg}}}{C_{\text{sig}} - C_{\text{bkg}}} \tag{2}$$

where *F* is the flux,  $\sigma_F$  is flux uncertainty,  $\sigma_{C,bkg}$  is the background concentration uncertainty,  $C_{sig}$  is the signal (downwind) concentration, and  $C_{bkg}$  is the background (upwind) concentration. This formula assumes equal precision on background and signal paths and ignores errors due to measurement deadtime and geometry as well as uncertainty in wind field measurements and inherent model uncertainty. Equation 2 is designed to capture the instrument contribution to measurement uncertainty. The average CH<sub>4</sub> enhancement (absolute value of the concentration difference between paths) measured by the CRDS and DCS over the course of the measurement campaign was approximately 600 ppb. Combining this average enhancement with our DCS precision of 25 ppb yields an average normalized DCS flux uncertainty of 6% using Eq. 2. For further comparison of CH<sub>4</sub> concentration measurements using DCS and CRDS, see the Supplementary Materials (fig. S3).

#### Concentration retrieval using cepstral analysis

The spectra are analyzed using a fit model derived from a combination of the HITRAN 2008 and 2016 databases and the cepstral-domain technique (22, 23, 33). HITRAN 2008 was used for all molecules except NH<sub>3</sub> for comparison with previous NIR DCS results. The dual-comb spectra are chopped into three bands: 1, 2, and 3, respectively, covering 179.3 to 184.3 THz, 197.2 to 200.7 THz, and 185.7 to 187.4 THz. These bands are used to retrieve  $CH_4$ ,  $CO_2$ , and  $NH_3/$ H<sub>2</sub>O, respectively (Fig. 2A). Temperature and pressure data for the fit model are provided by a sonic anemometer (69, 70) and a weather station, respectively, which were both located on the same tower during the measurement campaign (Fig. 2B). The bias associated with fixing the temperature to this external value has a statistically negligible effect on CH<sub>4</sub> and NH<sub>3</sub> emission rates (see the Supplementary Materials). Band 1 contains CH4, as well as weak carbon dioxide and water absorption features that are fixed by the fits from bands 2 and 3, respectively. The CH<sub>4</sub> model (HITRAN 2008) contains 108 features with line strength (S) > 10<sup>-22</sup> cm<sup>-1</sup>/(molecule × cm<sup>-2</sup>). A cepstral-domain filter (lifter) (33) that mimics a high-pass filter in the frequency domain removes comb baseline structure broader than ~100 GHz for band 1. Band 2 contains both CO2 and weak H<sub>2</sub>O absorption. Thirty-six CO<sub>2</sub> features from HITRAN 2008 with  $S > 10^{-24} \text{ cm}^{-1}/(\text{molecule} \times \text{cm}^{-2})$  are included in the fit model. The H<sub>2</sub>O concentration is held fixed at its value retrieved from band 3. A 40-GHz cepstral filter is used for band 2. Band 3 is fit to retrieve both H<sub>2</sub>O and NH<sub>3</sub> concentrations. Fits in band 3 must deal with a large amount of spectral interference between species (Fig. 2D). In all, 82 H<sub>2</sub>O features with  $S > 10^{-24}$  cm<sup>-1</sup>/(molecule × cm<sup>-2</sup>) and 39 NH<sub>3</sub> features with  $S > 10^{-21}$  cm<sup>-1</sup>/(molecule × cm<sup>-2</sup>) are included in the model for band 3. A 70-GHz cepstral filter is used for band 3. The filters are chosen by examining the structure of the cepstral fit residuals and are held constant for all analyses. Etalons are easily filtered out in the cepstral domain by adding notches to the cepstral filters to remove data points near the etalon appearance time (33). Strong H<sub>2</sub>O absorption and overlapping weak CO<sub>2</sub> absorption are also measured below 1490 nm but are not analyzed in this work due to challenges associated with fitting deep absorption features. All reported DCS and CRDS concentrations are the dry values with the water concentration fixed to the value from each respective sensor.

#### SUPPLEMENTARY MATERIALS

Supplementary material for this article is available at http://advances.sciencemag.org/cgi/ content/full/7/14/eabe9765/DC1

View/request a protocol for this paper from Bio-protocol.

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