GEO-CAPE Methane Working Group

Daniel Jacob (Harvard), David Edwards (NCAR), Kevin Bowman (JPL), Stan Sander (JPL) Daven Henze (U. Colorado)

Focus: define the specifications for the GEO-CAPE infrared instrument (GCIRI) to provide fine-scale information on methane emissions

Capabilities of different satellite observing systems for mapping methane emissions on regional to km scales

Daniel Jacob, Jianxiong Sheng, Alex Turner, Dan Cusworth



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Satellite observations of atmospheric methane and their value for quantifying methane emissions (Jacob et al., ACP2016)

Simple mass balance analysis to compare capabilities of different systems:



- Pixel resolution
- Return frequency
- Instrument precision

Instrument^a Regional source quantification Point source detection threshold^c (Q_{\min}, th^{-1}) $(Q = 72 \text{ th}^{-1} \text{ over } 300 \times 300 \text{ km}^2)^{\text{b}}$ SCIAMACHY 1-year averaging time 68 Geostationary observations could 1-year averaging time GOSAT 7.1 uniquely detect anomalous emitters by TROPOMI single pass (1 day) 4.2 NAd focusing on limited domains with high-GHGSat 0.25^{e} GOSAT-2 4-month averaging time 4.0 frequency observations and high pixel MERLIN 7-month averaging time^f NA resolution single pass (5-10 days) 0.80CarbonSat GEO-CAPE, single pass (1 h) 4.0 GeoFTS single pass (2 h) 0.61^g geoCARB single pass (2-8h)4.0 geo instruments 1.3 G3E single pass (2 h)

Regional-scale OSSE for the Southeast US

How does GeoCARB satisfy the GEO-CAPE GCIRI objectives?



- Cloud mask statistics from Remer et al, (2012) exclude 73-91% of data depending on pixel size and following GEOS-5 cloud cover
- Forward model column error of 12 ppb, temporal error correlation of 6 hours from GEO-Chem comparison to Lamont TCCON site

Sheng et al. [2018]

Quantifying forward model error statistics with hourly TCCON data

Hourly comparison of 0.25°x0.3125° GEOS-Chem to Lamont TCCON data for Aug-Sep 2013



Two key results:

- Forward model error dominates over instrument precision on 25 km scale
- 6-h temporal error correlation diminishes value of frequent return times

Sheng et al. [2018]

Comparing satellite observing systems by their DOFS Ideal: DOFS=216 (full mapping of 25x25 km² emissions)



- All systems are better than what SEAC⁴RS aircraft observations could do (DOFS=10)
- GeoCARB 2x/day delivers ~70% of GEO-CAPE (GCIRI) information
- GeoCARB 2x/day performs comparably to alternate schedule of (4x/day, 1x/day)
- TROPOMI is very sensitive to cloud cover, GeoCARB is not

Sheng et al., 2018

Kilometer-scale OSSE over the Barnett Shale

Can GeoCARB and other geo configurations quantify emissions on km scales?



Inverse square roots of eigenvalues of **F** give the methane flux thresholds for detecting the flux patterns described by the corresponding eigenvectors

Turner et al. [2018]

Eigenanalysis of Fisher information matrix



- TROPOMI can achieve ~30 km resolution on emissions in 1 week of observations, GeoCARB can achieve ~2-7 km depending on return frequency
- A next-generation instrument with 1.3x1.3 km² pixel resolution, 0.1% precision, hourly return could fully resolve the emission fields

Turner et al. [2018]

On 1-km scale, instrument precision matters more than return frequency



- Instrument precision better than 6 ppb is critical
- Temporal error correlation limits benefit from increasing return frequency

Turner et al. [2018]

Detecting anomalous methane emitters from space



Typical oil/gas field 20-100 wells in 50x50 km² domain



(Cusworth et al., 2018)

OSSE for 50x50 km² domain with 20-100 wells

Generate 500 emission scenarios by random sampling of bimodal pdfs



Detection of high-mode emitters by inversion with L-1 regularization (sparse solution):

 $\begin{array}{ll} \text{minimize cost function} & J(\mathbf{x}) = (\mathbf{y} - \mathbf{K}\mathbf{x})\mathbf{S}_{\mathbf{0}}^{-1}(\mathbf{y} - \mathbf{K}\mathbf{x})^{T} + \lambda \|\mathbf{x}\|_{1} \\ \text{with forward model error correlations of 40 km, 2 h} \\ \text{Diagnose success with categorical metrics: T/F for well in high-mode (P) or not (N)} \\ \text{Probability of detection} & \text{False alarm ratio} \\ \text{POD}(\%) = 100 \times \frac{\sum TP}{\sum TP + \sum FN} & \text{FAR}(\%) = 100 \times \frac{\sum FP}{\sum TP + \sum FP} \\ \end{array}$

Cusworth et al. [2018]

Probability of detection of high-mode emitters (POD) and false alarm ratio (FAR)

Sensitivity to the density of sites (50x50 km² domain)



- Problem gets harder as site density increases
- TROPOMI: OK with 20 sites
- GeoCARB 4x/day: 50 sites
- Next-generation: 100 sites

Cusworth et al. [2018]

Can a surface monitoring network complement the satellite data?

5-20 optimally placed surface monitors based on *k*-means of spatial distribution of sites



- Surface monitors augment capability of TROPOMI and GeoCARB
- GeoCARB usefully augments a surface network, TROPOMI mostly adds false alarms
- Next-generation satellite does it all no need for surface monitors

Cusworth et al. [2018]

Findings

- GeoCARB 2x/day delivers about 70% of GEO-CAPE recommendation (GCIRI) for regional mapping of methane sources. Alternating 4x/day and 1x/day gives comparable information to 2x/day
- GeoCARB 2x/day with precision < 6 ppb can map emissions down to 4 km and can detect anomalous emitters in a sparse field of point sources (1 site per 100 km²)

Recommendations

- A next-generation geostationary instrument with 1.3 km pixel resolution, hourly return, 0.1% precision would be transformative for mapping emissions at km-scale and for detecting anomalous emitters in dense fields
- Instead of the conventional paradigm of using geostationary satellites for continental-scale observations, consider focus on limited domains to enable higher pixel resolution and observation frequency – this would most usefully complement existing LEO capabilities.

GEOCAPE Methane Working Group: NCAR/ACOM Results

Publications

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Helen Worden Benjamin Gaubert Gene Francis Jérôme Barré, (now at ECMWF) Zhe Jiang, (now at USTC) David Edwards

Facilitating OSSEs: Averaging Kernel (AK) variability Simulated AK for column CH₄



CH₄ Column AK

CH₄ Column AK

Simulated column CH₄ observations



Simulated observations over daylight hours for July 2009

Nature run = GEOS-Chem

- 0.5° x 0.667° resolution
- Full chemistry
- CH₄ emissions from EDGAR v4 and GFED3

Only small ~0.1% differences between simulated observations using scene-dependent CH₄ AKs (LUT) and those using an average AK





Preparatory studies for the CHRONOS solution for GCIRI: Analysis of signal dependence on viewing parameters illustrate the GFCR advantage of increased D/A signal at higher SZA

Edwards et al., AMT, 2018

Including CH_4 emissions in DART/CESM Tested for CO, in development for CH_4



and propagate increments over time

Chemical response to CO assimilation

- MOPITT CO assimilation in CAM-chem in 2002
- Increases CO, particularly in the NH
- Overall improvement against validation
- Resulting decrease in OH; leads to reduced CH₄ oxidation; increases CH₄ lifetime from 8.7 to 9.3 years
- Increase in primary CO emissions is necessary, but also an increase in VOC that oxidize to CO



Gaubert et al., JGR, 2016

Decreasing CO abundance reduces methane lifetime



Although meteorology (MERRA vs. DART assim.) affects the CH_4 lifetime offset, the reduction (slope) in CH_4 lifetime is due mostly to decreasing CO.

Conclusions

- SWIR column CH₄ AKs depend mainly on SZA, satellite ZA and CH₄ amount.
- Only small differences (< 1%) in simulated CH₄ columns are found from using a scene dependent LUT column AK compared to an average AK for column CH₄
 - ➢OSSE results from previous SWIR CH₄ studies do not have large uncertainties from assuming an average AK
- Emission tool for including CH₄ emissions in DART/CESM being developed
- Lifetime of methane has significant dependence on changes in CO through OH
- Decreasing emissions of CO (e.g., BB and China) need to be included in model studies and assessments that aim to attribute changes in methane emissions, abundance, growth rates and lifetime
- Start using TROPOMI CH₄ to see what time/spatial scales are possible for emissions from LEO at 7 km
- Compare these to surface estimates for a well characterized regions (e.g. Greeley with NOAA mobile labs)

The role of wetland emissions within the North America geostationary domain

A. Anthony Bloom, Kevin Bowman, Meemong Lee

Wetlands & the NA CH4 budget

- Wetlands account to ~50% of NA CH4 budget.
- Major uncertainties on location and extent within and outside NA domain.
- Global constraints on magnitude lead to substantial error correlations between NA and the rest of the world.
- Constraints on NA and global wetlands key to NA GEO mission success.



Bloom et al., 2017, GMD

WetCHARTs mean

WetCHARTs: uncertainty

Atmospheric simulations of wetland CH4 within GEO-CAPE domain



Uncertainty: based on 3 wetland emission scenarios. Range comparable to WETCHIMP model range



1. GEO-CAPE XCH₄ observations can differentiate between summer-time (July-October) enhancements due to wetland CH4 emission scenarios (provided a 1.1% - approx. 20ppb - observational precision; Wecht et al., 2014).

2. Large uncertainty (comparable to typical XCH4 spatial variability) due to uncertainty in the magnitude and timing of wetland CH4 emissions.

GEO-CAPE North America Wetland OSSE

Objective: quantify GEO-CAPE CH₄ measurement constraints on NA wetland CH₄ emissions.

- Improving estimates of wetland CH₄ emissions at ~300km- 500km resolution is necessary to:
 - capture main continental wetland structures, and
 - Resolve the first order inter-model differences.

WETCHIMP model ensemble: mean wetland CH₄ emissions



WETCHIMP model spatial correlations



Satellite-constrained wetland CH₄ flux uncertainty







Step 1. Number of GEOCAPE and TROPOMI observations in July 2009 using MODIS cloud cover, ERA-interim cloud cover & sunshine hours.

Step 2. Construction of mock atmospheric operator using GEOS-Chem adjoint.

Step 3. Wetland CH₄ flux uncertainty, based on Monte Carlo perturbation of GEO-CAPE and TROPOMI concentrations using Wecht et al., 2014 observation uncertainty.

(Analysis described by Bloom et al., 2016).



Example CH₄ column influence function: derived using GOSAT averaging kernel and GEOS-Chem CH₄ adjoint.

MODIS cloud cover



- GEOCAPE: smaller pixel size increases cloud-free observation yield (despite ~60° angle from nadir)
- We use MODIS cloud cover statistics to derive ERA-interim cloud-free cover domain for GEOCAPE (0.6) and TROPOMI (0.5)

GEO-CAPE wetland CH₄ OSSE: example



July WETCHIMP uncertainty

- Example, July 2009: GEO-CAPE observations indicate factor ~2 improvement (relative to TROPOMI) in ~300km CH4 flux estimates in major NA wetland region.
- 2. Based on preliminary simulation of GEO-CAPE retrieved flux uncertainty, GEO-CAPE measurements will provide substantial constraints on WETCHIMP wetland model CH4 uncertainties.





1. GEOCAPE yields 60% uncertainty reduction (relative to TROPOMI) over NA wetlands

2. GEOCAPE advantage is largest in summer (coincides with largest CH_4 emissions).

3. Fewer sunlight hours in shoulder seasons reduce the relative advantage of GEOCAPE.

Satellite-retrieved and model ensemble CH4 flux uncertainty



North America (40N – 70N)

- Low Earth Orbit can improve median WETCHIMP CH4 uncertainty for 3-month period (Jun – Aug).
- Geostationary: can improve median WETCHIMP CH4 uncertainty for 5-month period (May – Sep).
- 3. Geostationary: can potentially constrain early season CH4 fluxes in highemission wetland regions.



Biogeochemical constraints on wetland CH4 emissions: lessons learned from Amazon OSSE



- Geostationary OSs can resolve CH4 fluxes at a sufficient resolution to distinguish between key biogeochemical process hypotheses
- Biogeochemical insights crucial for understanding seasonal and year-to-year evolution of NA CH4 budget

Conclusions

- Wetlands are a central component of the NA domain and its boundary conditions.
- Reducing uncertainties in magnitude and timing of wetlands key to deciphering the NA budget.
- Geostationary mission will provide substantial uncertainty reductions on wetland model CH4 emissions.
- Based on Amazon OSSE, geostationary mission will likely resolve fluxes at sufficient resolution to test biogeochemical process hypotheses, which are central to understanding the evolution of the NA CH4 budget.

Spare slides



Cloud cover: MODIS imagery was used to assess the role of pixel size in the abundance and spatial distribution of cloud-free CH4 observations.

Part 2: what observing system is needed to reduce biogeochemical process uncertainty?

Amazon CH₄ emissions as a case study



Bloom et al., 2016 (ACP)



A. Anthony Bloom, ESA LPS, May 2016

Observing system simulation experiment (OSSE)



Top-down CH₄ flux requirement: 333km, monthly, 10 mg CH₄ m⁻² day⁻¹



A. Anthony Bloom, Northern Permafrost Region Methane Budgets, March 2017

Simulated Geostationary CH₄, CO₂, CO and Aerosol Measurements Testbed: California Laboratory for Atmospheric Remote Sensing



Jet Propulsion Laboratory California Institute of Technology

Liyin He, Clare Wong¹, Thomas Pongetti¹, Qiong Zhang², Zhao-Cheng Zeng², Vijay Natraj¹, Sally Newman², Yuk L. Yung², Kevin Gurney³, <u>Stanley P. Sander¹</u>

¹NASA Jet Propulsion Laboratory, California Institute of Technology ²Division of Geological and Planetary Sciences, California Institute of Technology ³School of Life Sciences, Arizona State University

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Objectives for GEO-CAPE pre-phase A studies

- Using an observing system for trace gases that emulates a spectrometer in geostationary orbit, obtain spatially and temporally resolved fluxes of trace gases including CH₄, CO₂ and CO from column abundance measurements.
- 2. Assess the impact of confounding variables including high and low clouds and aerosols, topographic relief, and surface albedo variations
- 3. Use these results to refine the measurement and instrument requirements for instruments on future missions.
- 4. Continue to develop the technology for future imaging Fourier transform spectrometers such as PanFTS.

California Laboratory for Atmospheric Remote Sensing (CLARS)

Azimuthal Scan

1.7 km a.s.l.

Spectral bands: CO_2 (1.6 um) CH_4 (1.7 um) N_2O (2.3 um) CO (2.3 um) O_2 (1.27 um) Fu et al. AMT, 2014 **Two measurement modes:**

2. Basin

1. Direct sun (Spectralon)

FTIR Spectrometer

. TINS

CLARS reflection points

In situ tower stations
TCCON station

N

CLARS-FTS

4-8 mapping cycles/day depending on season, clouds and aerosols

Diurnal variations of Direct Sun & Basin XGAS

Direct Sun

6:00 PM



Correlation Between XCH₄ and XCO₂ Excess



Period: September 2011 – October 2013

- Tight correlations between XCO₂ and XCH₄ excess are observed at every reflection point even though they are emitted by different sources – why?
- Both species are chemically inert, so the variabilities of both CO₂ and CH₄ are controlled primarily by local emissions and advection.



Map of XCH₄:XCO₂ Excess Ratio



Basin-wide CH₄ emissions inventory

Using CLARS FTS XCH_4 : XCO_2 excess ratio measurements, basin-wide CH_4 emissions are given by:



CLARS-FTS Monthly Methane Emissions in the LA Basin



Annual monthly pattern of CH4 emissions is highly repeatable with large winter maximum

CLARS-FTS Monthly Methane Emissions in the LA Basin Winter Maxima



 CLARS-FTS data reveal prominent annual peaks in CH4 emissions as well as non-seasonal background emissions

Annual CH₄ Emissions Estimates in the past 10 years in Los Angeles



- CLARS observations are consistent with previous estimates.
- Scaled CARB CH₄ emissions from 2011 to 2013 were 2-31% lower than our estimates.

Tracking CH4 Transport Over the LA Basin from an Episodic Release: Aliso Canyon Natural Gas Storage Well Blowout



SoCal Gas **Repairing Porter Ranch leaking gas** well may take 4 months LA Daily News







- LA Daily News
- NG leak is due to a broken pipe below the surface.
- 4 months were required to drill a relief well to cap the leaking well with concrete

SoCal Gas

Snapshot (2 p.m.) images of XCH₄/XCO₂ from Aliso Canyon Leak started on 10/23 according to SoCal Gas



Spatial variability on short time scales demonstrates variability in atmospheric transport





Estimated CLARS CH₄ flux from SoCAB (6/1/2015 – 3/1/2016)



Inferring the Aerosol Vertical Profile from CLARS-FTS O₂ Observations



Aerosol scattering

- "Short-circuits" the optical path relative to the surface
- Increases the observed radiance for highly scattering aerosols

Sensitivity of radiance and lineshape to aerosol

MiniMPL aerosol backscatter at Caltech

Two consecutive days (ensure similar geometries) with different aerosol loadings

Oxygen band at 1.27 um



Enhancement in CLARS continuum radiance

Liou (2002) Richardson et al. (2016)



Sorted radiance

- Sort the clear-day radiance and then apply to hazy-day radiance
- The advantage of this sorting will be obvious when studying the impact of aerosol profiles (next slide)

Retrieval of aerosol vertical profile



3 scenarios: Same aerosol loading but at different altitudes



(a) The continuum level doesn't change with aerosol layer height because scattered light is not absorbed;
(b) The effect of scattering in line wings relative to line cores depends on the aerosol layer height.
-> the sorted radiance provides two pieces of information to constrain total and profile AOD



Retrieve the profile by fitting the radiance



Zeng et al. in preparation (2018)

Geostationary Imaging Fourier Transform Spectrometer: Hourly Sampling of XCO₂, XCH₄, XCO

500 km x 500 km scene is imaged onto a 128x128 pixel focal plane array which provides a 2.7x2.7 km size pixel at nadir and records spectra in every pixel for 60 seconds per scene



Spectra in every pixel captures rapidly evolving tropospheric chemistry



Panchromatic Fourier Transform Spectrometer (PanFTS): Engineering Model for Geostationary Chemical Imaging

- Spectral Coverage: 0.3-10 μm
- 2 Dynamically Aligned Plane Mirror Michelson Interferometers MOPD = 10 cm
- 3 Cameras: 128x128 focal plane arrays with in-pixel digitization
- 2.7 km nadir ground sampling/pixel from geostationary orbit



PanFTS Engineering Model being inserted into JPL's 10-foot thermal-vacuum chamber for environmental testing in vacuum at -100 °C.

GEO-PanFTS Engineering Model Demonstrated in LA

PanFTS measures CO₂, CH₄, CO, SIF and aerosols in a 128x128 pixel scene
Like OCO-2, PanFTS uses sunlight reflected from the land surface
PanFTS at CLARS simulates soundings from GEO

128x128 scene



Findings and Recommendations

- Observational data from CLARS, which mimic a geostationary platform, confirm the value of persistent measurements with high temporal, spatial and spectral resolution
- CLARS results on CH₄ show that the additional data volume provided by GEO mapping on dense space-time grids will enable more accurate determinations of regional trace gas fluxes.
- Enables the jump from mapping missions to process-oriented missions.
- Geostationary observations are well-suited to capture rapidly evolving emissions from industrial accidents, hot spots and other episodic emissions such as the Aliso Canyon natural gas well leak.
- A GEO mission/constellation should be an integral part of NASA's mission strategy for the aerosol, trace gas/ozone and greenhouse gas targeted observables in the 2018 Decadal Survey.

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