Satellite Measurements of Greenhouse Gases

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Overview of this Afternoon

- 1. Basic Concepts of Remote Sensing
- 2. Remote Sensing of CO₂
- 3. Computer-based Activity

Relevant Literature:

- G. Petty A first course in Atmospheric Radiation
- G. Stephens Remote Sensing of the Lower Atmosphere
- W.G. Rees physical Principles of Remote Sensing
- R.M. Goody and Y.L. Yung Atmospheric Radiation
- K.N. Liou An Introduction to Atmospheric Radiation

Section 1:

Basic Concepts of Remote Sensing

What is Remote Sensing?

"Remote sensing is the science and art of obtaining information about an object, area, or phenomenon through the analysis of data acquired by a device that is not in contact with the object, area, or phenomenon under investigation"

(Lillesand and Kiefer 1987)

"Remote sensing is the acquisition of information of an object or phenomenon, by the use of either recording or real-time sensing device(s) that is not in physical or intimate contact with the object"

(Wikipedia)

In practice, remote sensing is the utilization at a distance (as from aircraft, spacecraft, satellite, or ship) of any device for gathering information about the environment, e.g. an aircraft taking photographs, earth observation and weather satellites

What is Remote Sensing?

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Remote Sensing: A New Technology?
Some early remote sensing methods
are still in use today.

An Example from the Early Days

So what do we see?





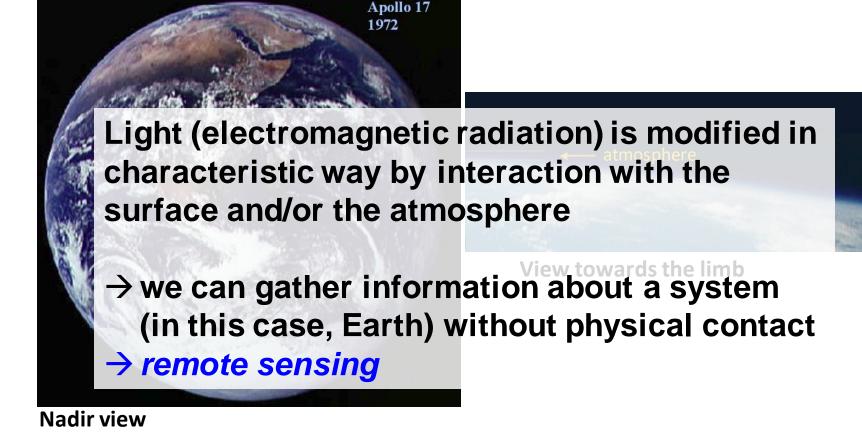
View towards the limb

Nadir view

An Example from the Early Days

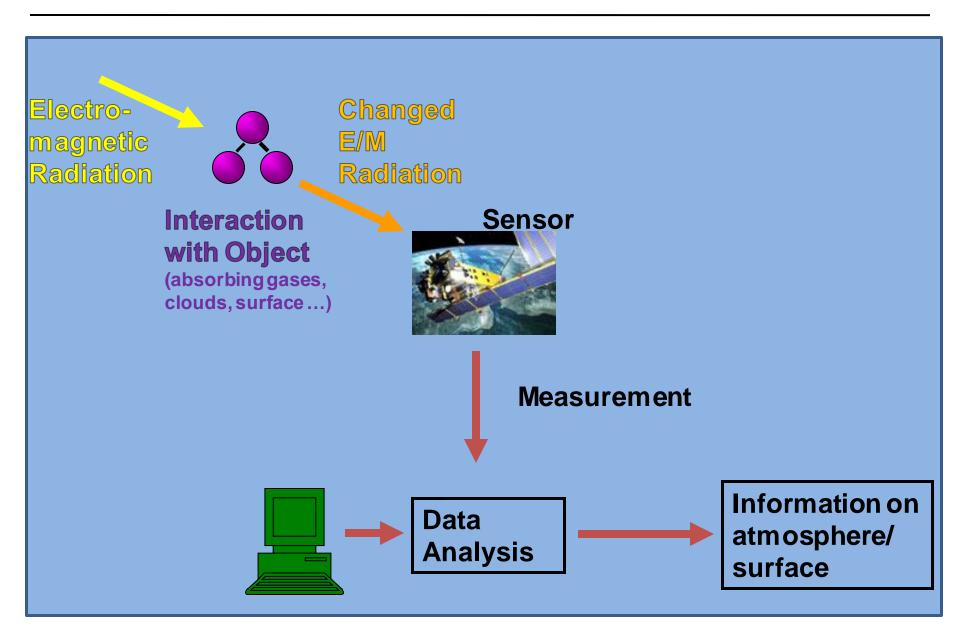
So what do we see?

- Clouds, different surfaces, light scattered from the atmosphere ...



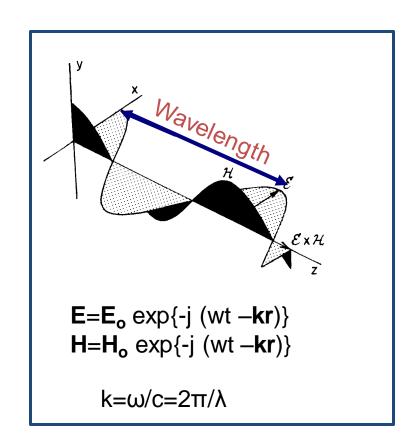
Apollo 11

Principle of Remote Sensing Observations



Electro-Magnetic Radiation: Basic Properties

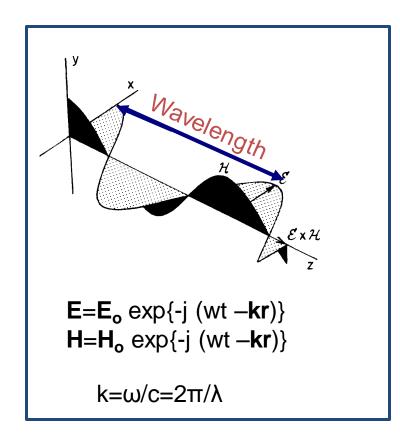
- EM radiation is created via mutual oscillations of electric fields E and magnetic fields H
- Direction of propagation of an EM wave is orthogonal to direction of oscillations (E, H, k form orthogonal system)
- EM waves travel at the speed of light: c = c₀/n,
 where n is refractive index of medium
- Oscillations can be described in terms of:
 - wavelength (λ): distance between individual peaks in the oscillation
 - frequency ($v = c/\lambda$): number of oscillations per second
 - wavenumber (= $1/\lambda$): number of wave crests (or troughs) per length
 - Wavelength, (frequency) and wavenumber are often used interchangeably



Electro-Magnetic Radiation: Basic Properties

Three basic properties describe EM radiation:

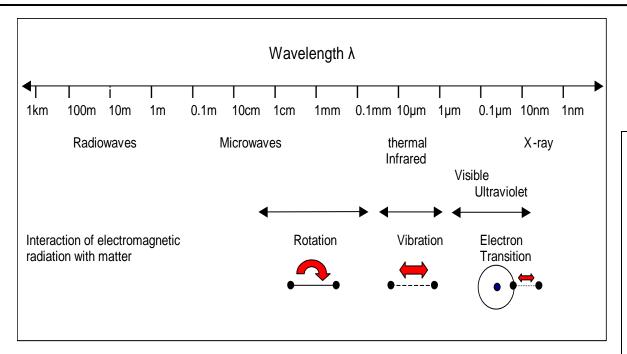
- Frequency determines how radiation interacts with matter
 - Rule of thumb: high frequency oscillations (e.g. UV wavelengths) interact with smallest matter (e.g. electrons), whilst low frequency oscillations (IR and microwave) interact with larger matter (e.g. molecules, water droplets, particles)
- Amplitude E_0 directly defines the amount of energy carried by an EM wave (Poynting vector): proportional to $|E_0|^2$
- Polarization defines orientation of oscillation which can affect way radiation interacts with matter (e.g. Fresnel laws)



For the purposes of this course, we are interested primarily in energy carried by EM radiation, how it is affected by interactions with matter, and how those interactions vary spectrally (as a function of wavelength)

Electromagnetic spectrum

Highest Energy



Lowest Energy

The energy of a photon is determined by frequency v:

$$E = h \nu = h \frac{c}{\lambda}$$

c: speed of light

h: Planck constant

UV/Vis and near-IR: Electronic and vibrational transitions

Thermal IR: Vibrational transitions

• Microwaves: Rotational transitions

Usually a combination of the different transition types occur

Black Body Radiation

A black body is a body or gas volume that

- has constant temperature
- absorbs all incoming radiation completely
- has the maximum possible emission in all directions (isotropic) and at all wavelengths

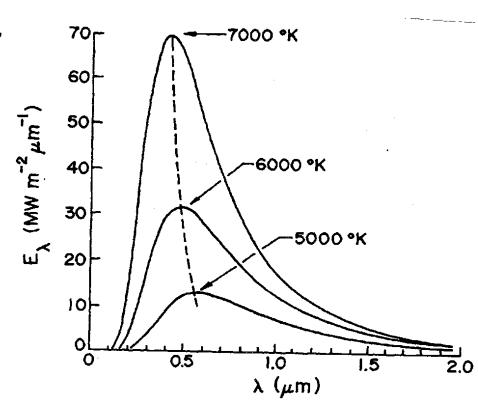
The Planck function describes the energy flux, $B(\lambda,T)$, emitted by a black body

B(λ ,T), is characterised by:

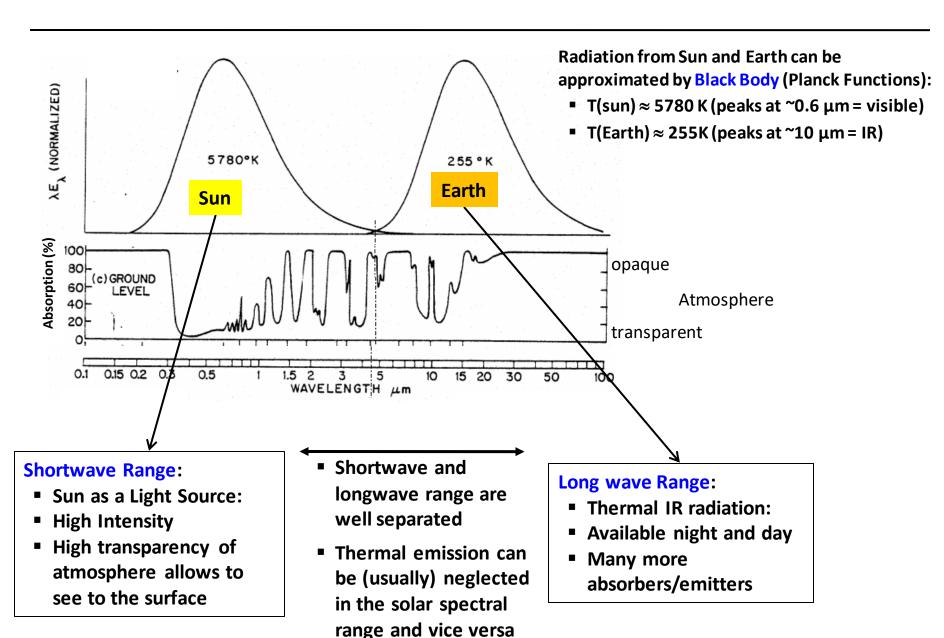
- Large dependence on λ
- Total emitted power increases strongly with temperature (~T⁴) - Stefan Boltzmann Law
- Well defined maximum for given T that is at smaller λ for larger T (*Wien law*)
- Emission from real object is given by:

$$I(\lambda) = \varepsilon(\lambda) B(\lambda,T)$$

with spectral emissivity $\varepsilon(\lambda)$



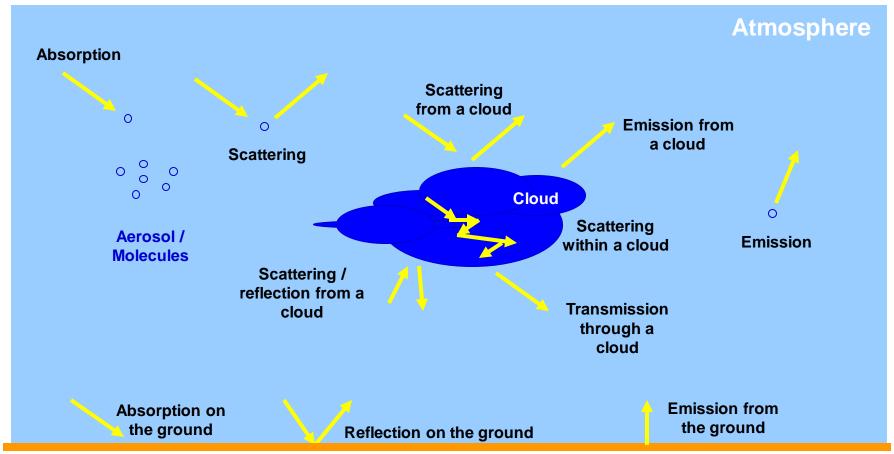
Two Main Sources for E/M Radiation



Overview of Radiative Transfer Processes



Interaction of Photons (E/M radiation) with Surface and Atmosphere generates the signals that we are interested in!



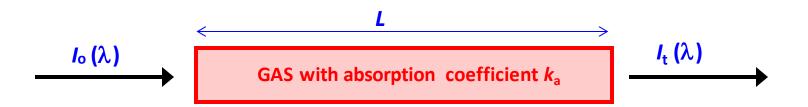
Beer-Lambert Law: The Conventional Case

The Beer-Lambert (-Bouget) Law: if a signal of intensity $I(\lambda)$ passes a distance, dL, through a homogenous medium with absorption coefficient, k_a (per unit distance):



Beer-Lambert Law: The Conventional Case

The Beer-Lambert (-Bouget) Law: if radiation of intensity $I(\lambda)$ passes a distance, dL, through a homogenous medium with absorption coefficient, k_a (per unit distance):



For a short path d*L*: $dI(\lambda) = -k_a(\lambda)IdL$

Then $I_{t}(\lambda) = I_{0}(\lambda) \exp \{-k_{a}(\lambda) L\}$ assuming $k_{a} = \text{constant}$

And transmissivity: $T(\lambda) = I_t(\lambda) / I_0(\lambda) = \exp\{-k_a(\lambda) L\}$

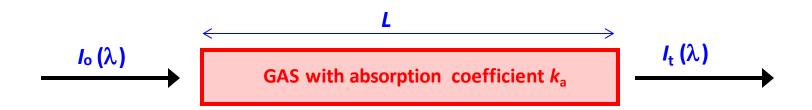
or $T(\lambda) = \exp \{-\sigma(\lambda) c L\} = \exp \{-\tau\}$

 $\sigma(\lambda)$: the absorption coefficient per molecule

c: density of molecules per unit volume

τ : optical depth

Transmissivity: The Purely Absorbing Case



And transmissivity: $T(\lambda) = I_t(\lambda) / I_0(\lambda) = \exp\{-k_a(\lambda) L\}$

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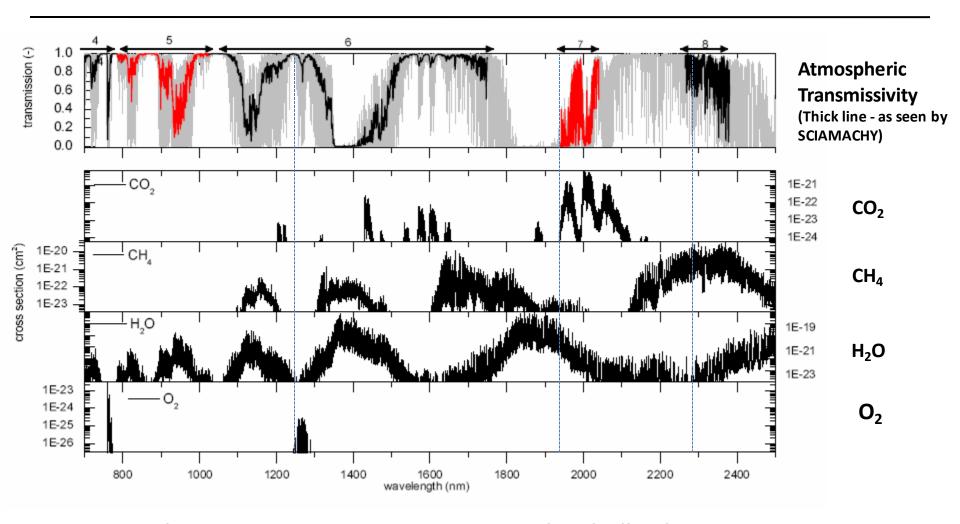
c: density of molecules per unit volume

τ : optical depth

→ Three factors matter:

- Spectroscopy: absorption cross section $\sigma(\lambda)$ [cm²/molecule]
- Composition: $c = \chi c_{air}$ [molecules/cm³]
- Photon path length: geometrical distance = L

Gas Transmissivity and Absorption Cross Section: Near-Infrared



- 100 % Absorption, 0% Transmissivity = Gases absorb all radiation
- Absorption depends on strength of absorption cross section (per molecule) and total number of molecules along path

Example:

Calculate the transmissivity of well mixed gases CO₂, CH₄ and O₂ in the near-infrared...

Use:
$$T(\lambda) = \exp{-\{\sigma(\lambda) c L\}}$$

Or more accurate:
$$T(\lambda) = \exp{-\int_L \sigma(\lambda, p(L), T(L))} \times c(L) dL$$

Which we approximate by:
$$T(\lambda) = \exp{-\left\{\sigma(\lambda, p, T) \times \chi \times VCD_{air}\right\}}$$

Given mixing ratio χ for each gas, and vertical column density VCD of air = 2.14x10²⁵ molec/cm² ...

- CO_2 : $\chi = 380$ ppm and $\sigma(\lambda = 1.95 \mu m) = 1x10^{-21} cm^2 \rightarrow T = exp{-8.1} = <math>3x10^{-3}$
 - CH₄: $\chi = 1800$ ppb and $\sigma(\lambda = 2.3 \mu m) = 4x10^{-21} \text{ cm}^2 \rightarrow T = \exp\{-0.15\} = 0.86$
- O_2 : $\chi = 0.2$ and $\sigma(\lambda = 1.27 \ \mu m) = 1x10^{-25} \ cm^2 \rightarrow T = exp{-0.43} = 0.65$

The Infrared Case



$$T(\lambda) + a(\lambda) + R(\lambda) = 1$$
 : conservation of energy !!!

- here $R(\lambda)$ includes both reflection and scattering

For a gas (atmosphere) in the infra-red: $a(\lambda) = \varepsilon(\lambda)$ (Kirchhoff law) and $R(\lambda)=0$.

Hence $a(\lambda) = \varepsilon(\lambda) = 1 - T(\lambda)$, and there are 2 signals emerging:

- 1. Absorption by the gas in the volume: $I_t(\lambda) = (1 \alpha(\lambda)) I_0(\lambda) = \mathcal{T}(\lambda) I_0(\lambda)$
- 2. Emission by the gas in the volume: $I_{t}(\lambda) = \varepsilon(\lambda) \times B(\lambda,T) = a(\lambda) \times B(\lambda,T)$ = $(1 - T(\lambda)) \times B(\lambda,T)$

The Infrared Case



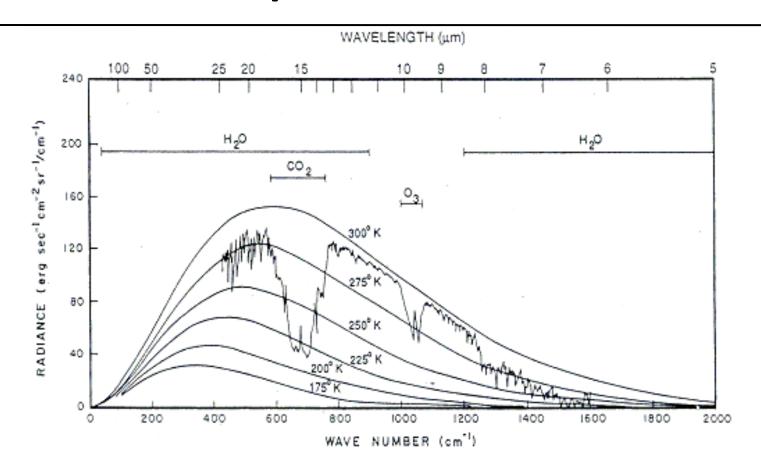
Hence, the total signal $I(\lambda)$ is given by:

$$I(\lambda) = T(\lambda) I_0(\lambda) + (1 - T(\lambda)) \times B(\lambda, T)$$
Surface contribution Atmosphere contribution

Limiting cases:

- 1. $T(\lambda) \rightarrow 1: I(\lambda) = T(\lambda) I_0(\lambda)$ [Known as a *spectral window* also N.B.]
- 2. $T(\lambda) \rightarrow 0: I(\lambda) = (1 T(\lambda)) \times B(\lambda, T)$ [100% absorption, known as saturation]
- N.B. : If: a) term 1 >> term 2 or b) if $T_{\rm gas} \approx 0$ K (!) then case 1) would be true and conventional use of $\mathcal{T}(\lambda)$ alone is fine, e.g. UV-visible wavelengths on Earth, or hot source relative to cold gas.

Emission spectrum of the Earth

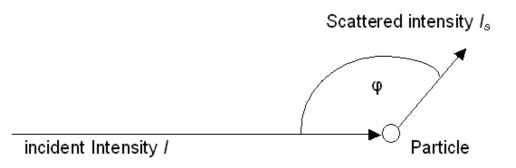


- Earth surface emits radiation with T~280 K
- Gases (H₂O, CO₂, O₃ etc) in atmosphere absorb and re-emit with emissivity equal to the absorptivity (Kirchoff's Law).
- Gas is at a colder temperature and hence emits with a lower Planck function

Scattering Processes in the Atmosphere

Basic Considerations:

- Scattering removes fraction of radiation along one direction and directs it into other directions
- Photons passing through a medium may encounter only one particle (single scattering) or many particles (multiple scattering)
- Scattering in the atmosphere occurs from molecules (Rayleigh scattering)
 and aerosol/cloud particles (Mie scattering)



Main Parameters:

- Scattering cross section σ_s(effective area for scattering)
- Scattering phase function p(φ) (direction)

Scattering by Molecules (Rayleigh Scattering)

- Scattering by molecules can be described as radiation from a oscillating dipole (Hertz Dipole)
- Rayleigh scattering cross section:
 - $\sigma_s^{Rayleigh}(\lambda) \sim \lambda^{-4}$
- Rayleigh scattering is very efficient for short wavelength
 - Sky appears blue
 - UV radiation is usually scattered before reaching the surface
- Rayleigh scattering polarises light
 - skylight is polarised
 - the maximum of polarisation is reached at 90° scattering angle





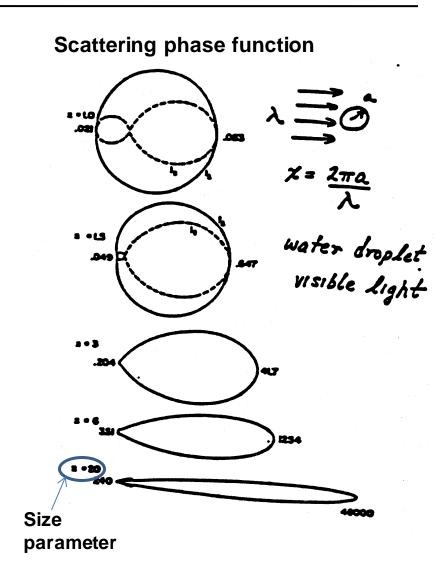
Photography: Polarization filters can be used to remove polarized skylight

Scattering on Particles (Mie Scattering)

- Explained by coherent scattering from many individual particles (dipoles)
- Mie scattering can be computed using Maxwell equations for spherical particles (Mie theory)
- Scattering/absorption properties are complex functions of chemical composition, size and shape of particles (sea salt, dust, sulphate ...)
- The larger the particles, the stronger the forward peak
- Scattering cross section:

$$\sigma_s^{Mie}(\lambda) \sim \lambda^{-1} \dots \lambda^{-1.5}$$

- Scattered light by aerosols/clouds is white-ish
- Mie scattering is the dominant scattering term for larger λ



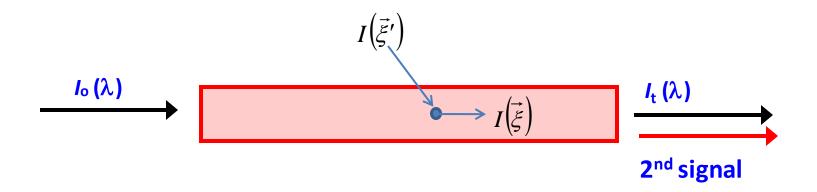
Scattering example:

• Compare probability for Rayleigh and Mie Scattering between ultra-violet (λ = 300 nm) and visible red (λ = 1 micron):

- Rayleigh scattering ~ λ⁻⁴ → (300/1000)⁻⁴ ≈
 120
- Mie scattering ~ $\lambda^{-1.5}$ \rightarrow (300/1000)^{-1.5} \approx 6

→ Rayleigh scattering will dominate in ultra-violet and Mie scattering in infrared

One more scattering effect...



- Light can also be scattered from outside the volume into the viewing direction
- This term is difficult to calculate and leads to a second signal (an additional source) similar to the emission term
- This additional source term is a major difficulty for finding a solution to a radiative transfer problem (and in general the problem requires a dedicated RT solver)

Surface Reflection of E/M Radiation

- Photons can be absorbed and/or reflected by the Earth surface
- The surface albedo is fraction of incoming solar radiation reflected by surface, integrated over all viewing directions
- Usually assume a Lambertian surface, where reflected intensity does not depend on viewing angle
- The wavelength-dependence of the albedo depends on surface characteristics (and provides information about surface)

In reality: Surface reflectance is a function of direction and is characterised by the BRDF (bidirectional reflection distribution function).

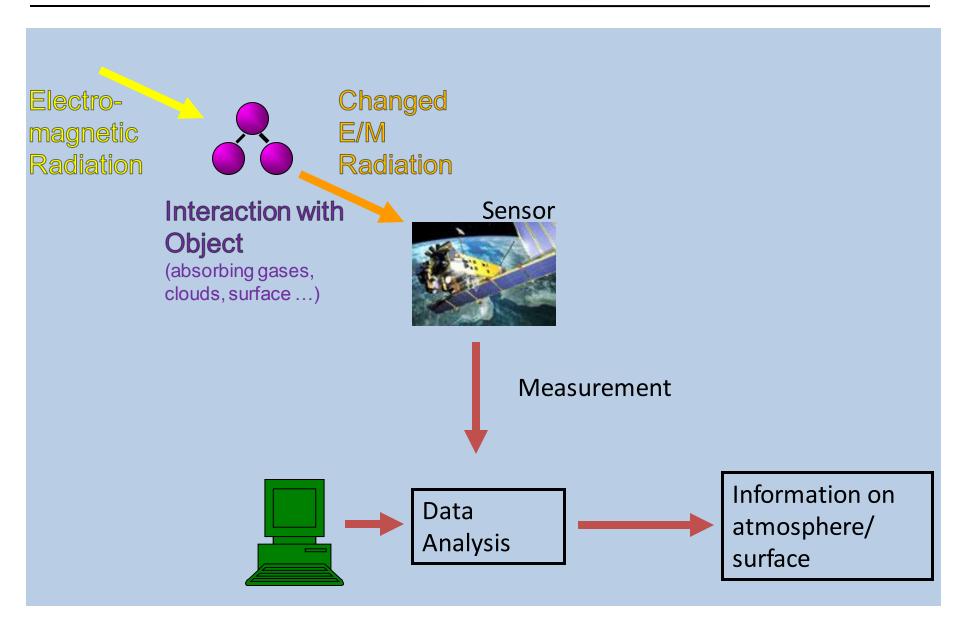


http://geography.bu.edu/brdf/brdfexpl.html

Section 2:

Remote Sensing of CO₂ in the shortwave-infrared spectral range

Principle of Remote Sensing Observations

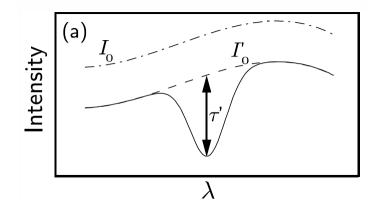


Absorption Spectroscopy Allows Measurement of Gases

- Main assumption: no scattering
- Beer-Lambert law:

$$I(L) = I_0 \exp\left(-\int_0^L \sigma(L') c(L') dL'\right)$$

and thus:



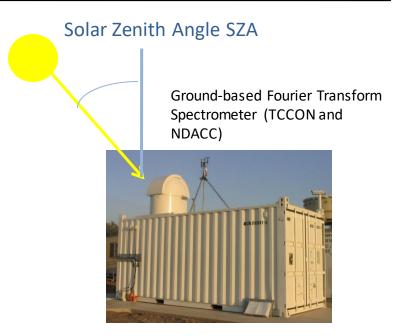
$$\tau(L) = -\ln(I/I_0) \approx \sigma(\overline{T}, \overline{p}) \times SCD$$
 Slant column density gives the number of mean temperature and pressure Slant column density gives the number of molecules per area along
$$SCD = \int_0^L c(L') dL'$$

 For atmospheric measurements, a more useful quantity is the vertical column density VCD: number of molecules per area along the vertical direction for the whole atmosphere

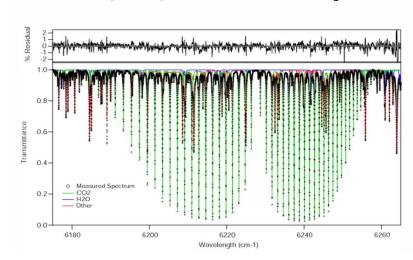
$$VCD = \int c(L')dL'$$
 - How can you obtain VCD from SCD?

Example: Direct-Sunlight Observations from the Ground

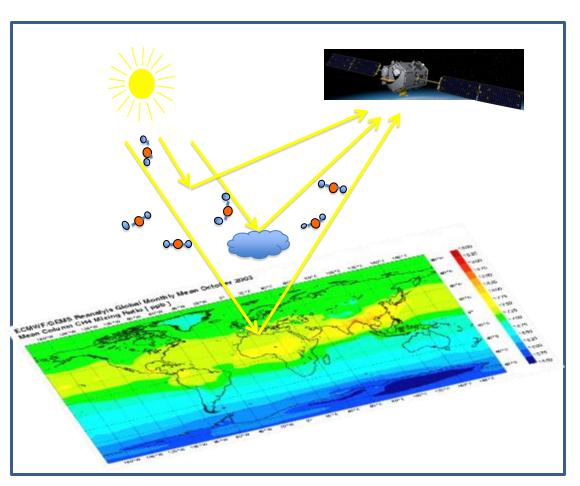
- The principal of absorption spectroscopy is valid for direct-sunlight observations:
 - No surface effects
 - High intensity source, so scattering into observer-direction is not important
 - Scattering leads to broad reduction of total intensity but will not change the optical depth due to gaseous absorption
- Direct sunlight observations:
 - Relation between slant path and vertical path is given by geometric factor of 1/cos(SZA)



Example of spectral fit to 6228 cm⁻¹ CO₂ band



The Retrieval Problem for Satellite Observations



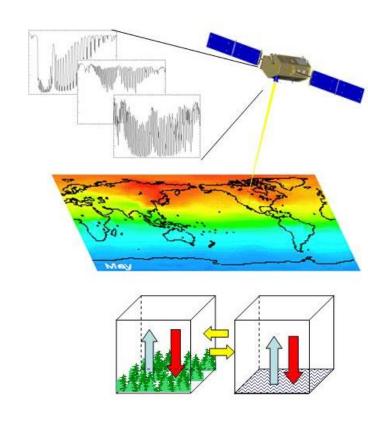
For accurate retrievals of CO₂ we need to be able to deal with:

- Multiple-scattering
- Aerosols and thin clouds
- Polarization
- Surface properties
- Gas absorption (spectroscopy)
- Topography
- Atmospheric state (T, H₂O,p)
- •

The Approach for CO₂ Column Observations from Space

Approach:

- Collect spectra of CO₂ and O₂ absorption in reflected sunlight in the shortwave-infrared region
- Use these data to resolve variations in the column averaged CO₂ dry air mole fraction,
 X_{CO2} over the sunlit hemisphere
- Validate measurements to ensure X_{CO2}
 accuracies of 1 2 ppm (0.3 0.5%) on regional scales at monthly intervals ('tie data to WMO standard')

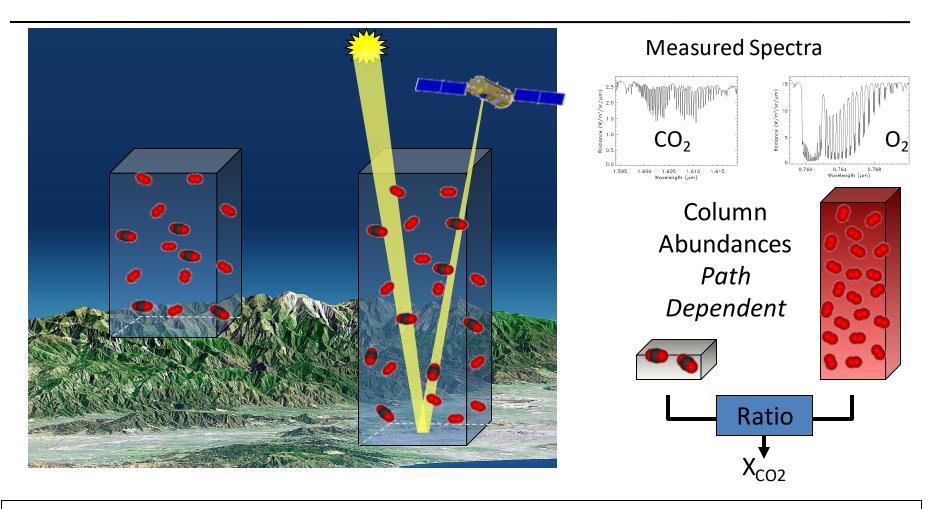








What is column averaged CO₂ dry air mole fraction X_{CO2}?

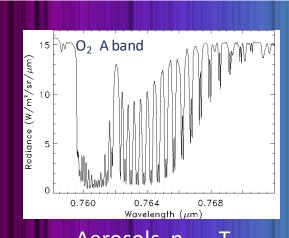


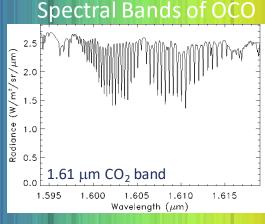
Normalization removes effects of varying surface pressure & topography

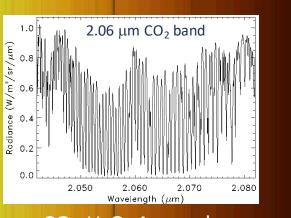
 \rightarrow 26-meter change in surface elevation equals 0.3% (1 ppm) change in X_{CO2}

Measurement Approach

- Measurement of SWIR CO₂ and O₂ bands to retrieve information on scattering (aerosol/clouds) together with CO₂:
 - 1.61 μm CO₂ band: Column CO₂
 - 2.06 μm CO₂ band: Column CO₂, clouds/aerosols, H₂O, Temperature
 - 0.76 μm O₂ A-band: Surface pressure, clouds/aerosols, Temperature
- Instruments are specifically designed for CO₂ column observations:
 - High spectral resolution
 - Large number of key parameters can be retrieved independently
 - Enhanced sensitivity and minimized biases due to interferences





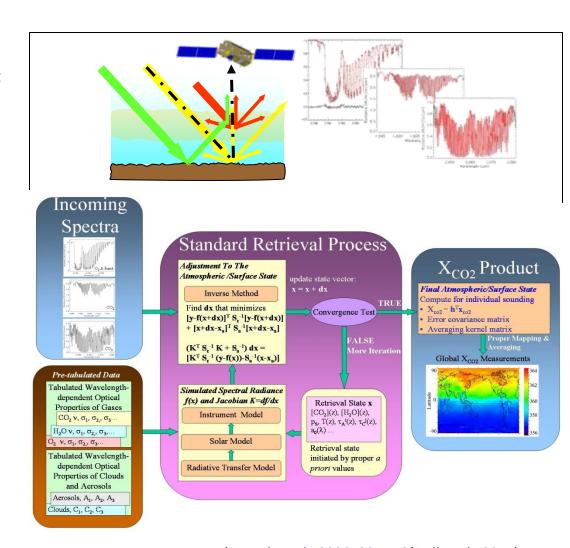


Aerosols, p_{surf}, T CO₂ Column

CO₂, H₂O, Aerosols

'Full-Physics' Retrieval Algorithm

- Accurately retrieving CO₂ (and CH₄) is extremely difficult and time-consuming:
 - Retrieved CH₄ and CO₂ will depend on assumptions of retrieval algorithm (retrieval biases)
- Forward Model needs to describe accurately physics of measurement:
 - Multiple-scattering RT
 - Polarization Correction
 - Spherical Geometry
 - Surface (polarized) BRDF
 - Instrument Model
 - Solar Model
- Inverse Method estimates state:
 - Rodgers' optimal estimation technique (based on Bayes' theorem)



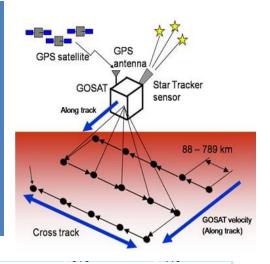
(Boesch et al., 2006, 2011, O'Dell et al., 2011)

Greenhouse gases Observing SATellite (GOSAT) launched January 23rd 2009

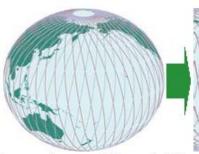


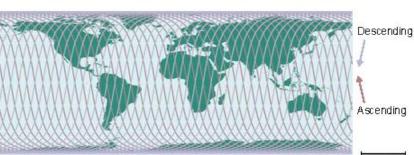
Mission objectives:

- 1) To monitor the density of greenhouse gases precisely and frequently worldwide.
- 2) To study the absorption and emission levels of greenhouse gases per continent or large country over a certain period of time.
- 3) To develop and establish advanced technologies that are essential for precise greenhouse-gas observations.









Conceptual diagram of GOSAT observation and the satellite orbits (three days, 44 orbits)

5000km (on the Equator)

The GOSAT Payload

TANSO - FTS

Provides spectrally-resolved radiances for 4 shortwave-IR (polarized) and thermal-IR bands

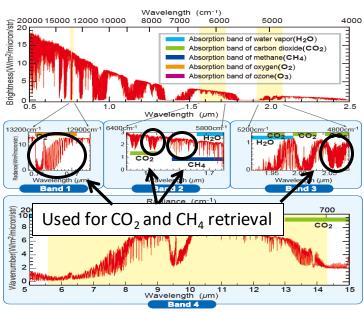
Covers several absorption bands of CO₂, CH₄, O₃ and H₂O (and others) and O₂

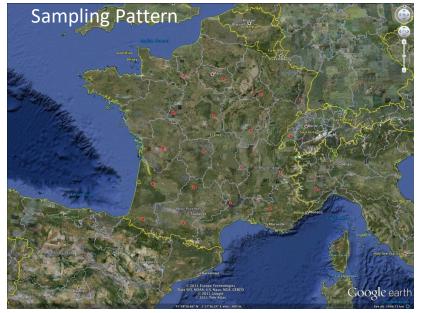


TANSO - CAI

4 broadband channels from UV to SWIR with high spatial resolution

Provides aerosol and cloud information required for the greenhouse gas retrieval



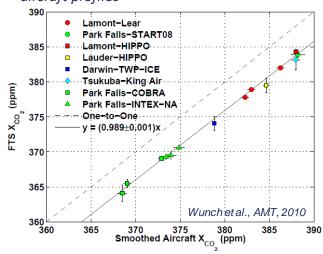


Validation against ground-based TCCON

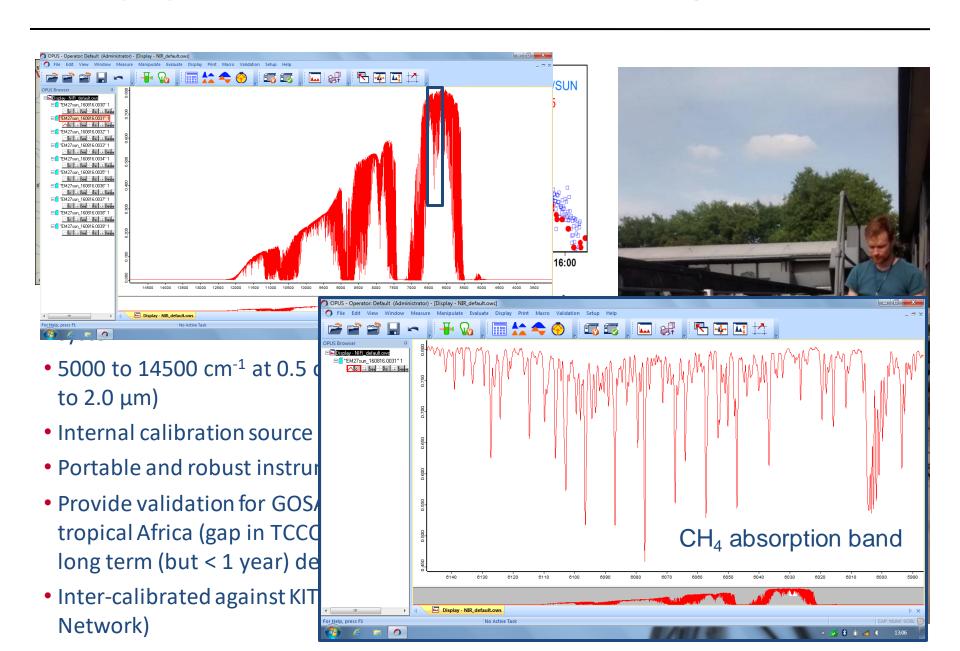
- TCCON (Total carbon column observing network) network of ground-based Fourier Transform Spectrometers
- Provides precise, accurate total columns of CO₂, CH₄ and other gases
- Ideal for satellite validation uniformity of instrumentation and data processing methodology across the network
- Lack of TCCON sites in Asia, South America and Africa: deployment of portable FTS's to fill the gaps in validation?





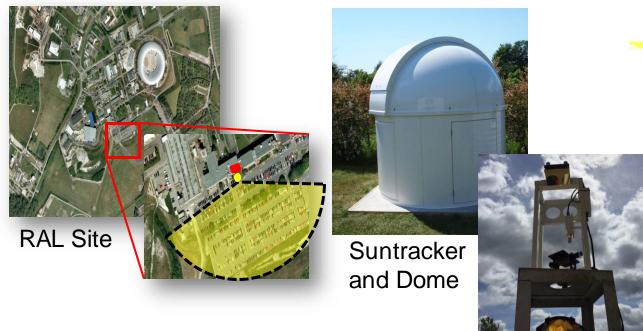


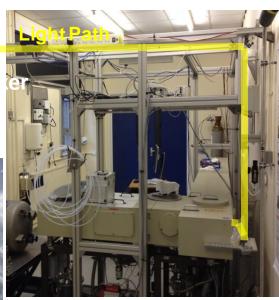
Deployment of Bruker EM27/SUN FT-IR in Uganda in 2018



Setup of a UK TCCON Site at Harwell

- NCEO and RALSpace Collaboration
- Instrument: Bruker 120HR with Resolution = 0.0015cm⁻¹ (OPD 6m)
- Large external Sun tracker with dome

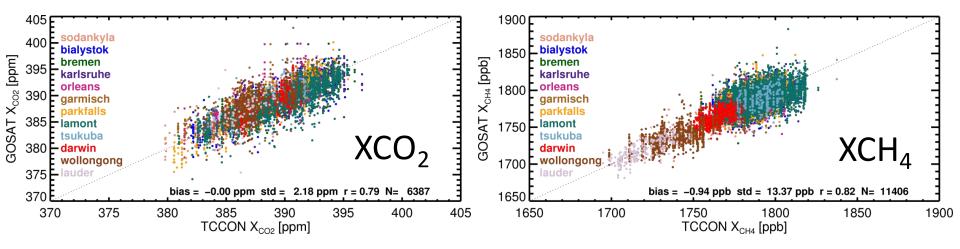




Bruker FTS

Validation of XCO₂ and XCH₄

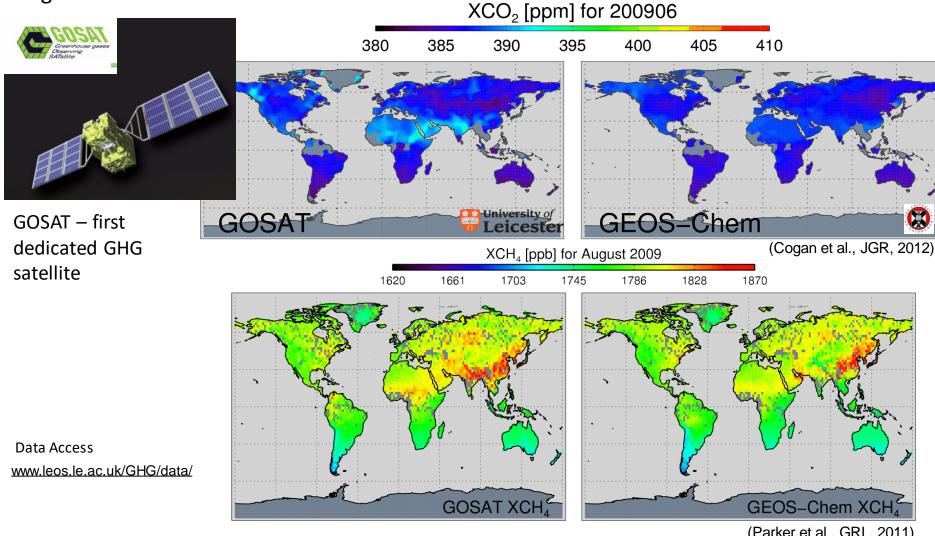
- Comparison against 12 TCCON sites (covering different geophysical regimes)
- Co-location criteria: +/- 5°



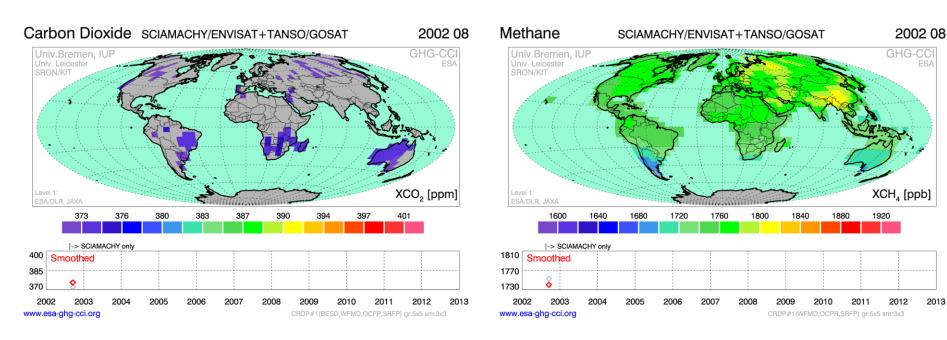
- Data is bias-corrected globally which results in a bias of 0 ppm to TCCON.
- Small (<0.06%) bias between GOSAT and TCCON (no bias correction necessary)
- Relies on model XCO₂ to normalise the XCH₄/XCO₂

Testing Model Calculations with GOSAT

Dedicated satellite missions provide unprecedented global view of release and uptake of CO₂ and CH₄ by surface processes to critically test and improve models and to track main emission regions



More than 10 years of CO₂ and CH₄ from Space



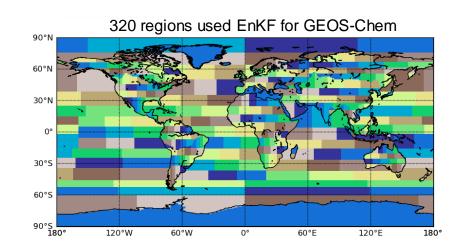


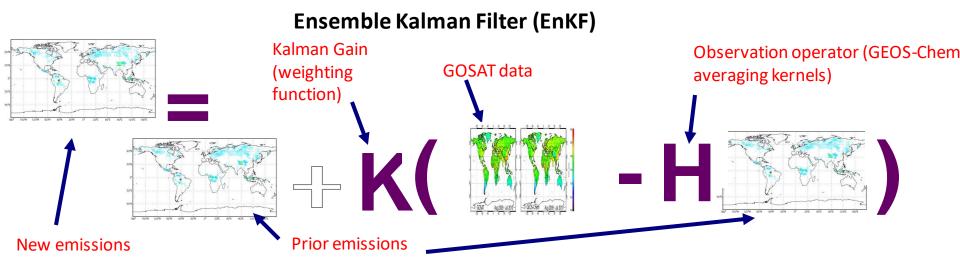


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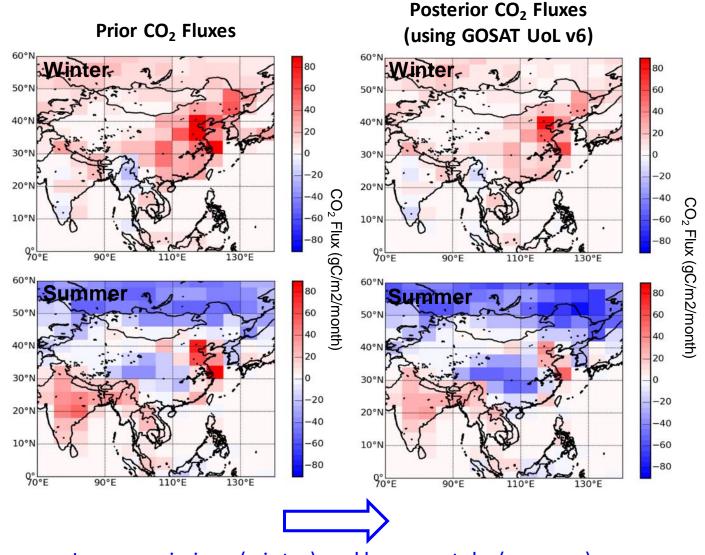
Surface Fluxes

- We need to consider atmospheric transport if we want to link atmospheric CO₂ to surface fluxes
- This is done by assimilation of satellite data into an offline transport model
- Example: Ensemble Kalman Filter for GEOS-Chem which optimizes CO₂ or CH₄ fluxes for 320 regions (land and ocean)





Example: Estimating CO₂ Surface Fluxes from GOSAT over China

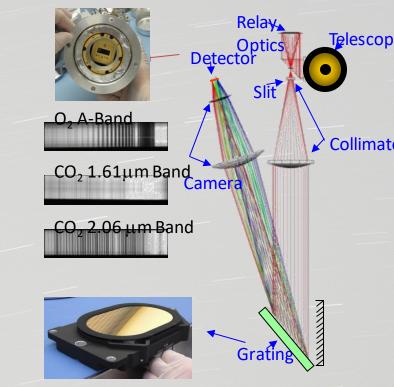


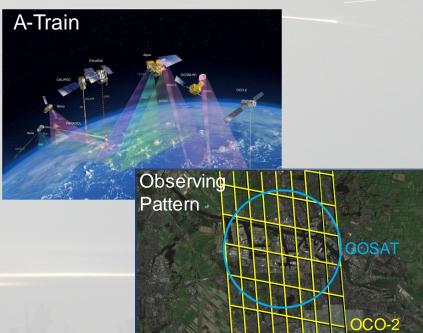
Lower emissions (winter) and larger uptake (summer)



What is OCO-2?

- First dedicated CO₂ mission by NASA
- Copy of the failed OCO-1 mission (launched in 2009)
- High resolution gratin spectrometer that measures reflected sunglint in the near and shortwave-infrared
- OCO-2 flies at the head of A-Train, but
 217 km East of AQUA
- OCO-2 carries out nadir and sunglint (ocean) and target (over validation sites) observations
- The ground track is 10 km width with 8 across track pixels of area 3km²
- OCO-2 generate 100x more soundings than GOSAT with higher SNR

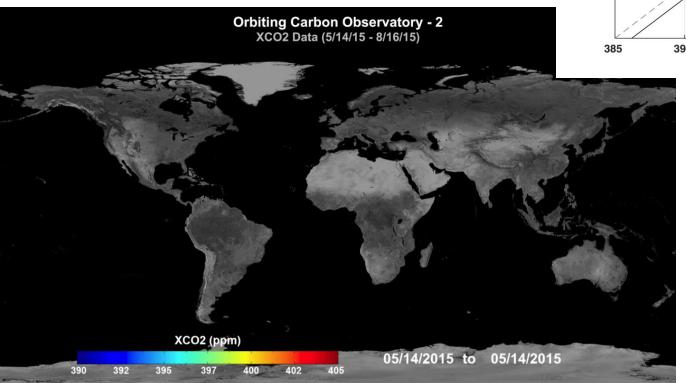


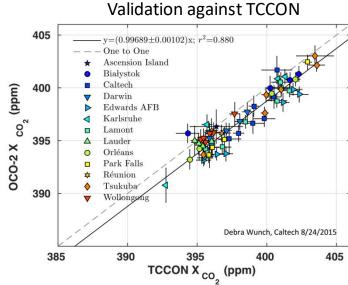


OCO-2 CO₂ Results

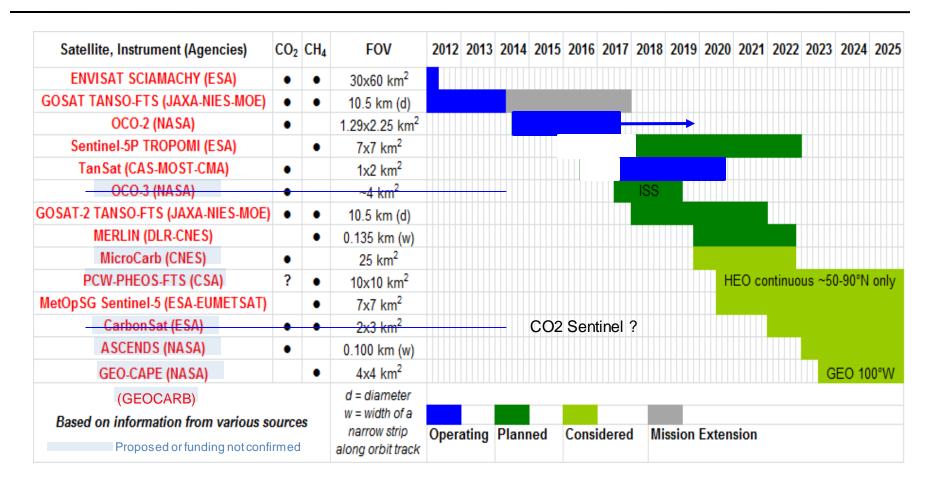
OCO-2 offers CO₂ (+ SIF) observations with much higher precision and coverage than GOSAT

A Quick Look at the First 13 Months of Operations:





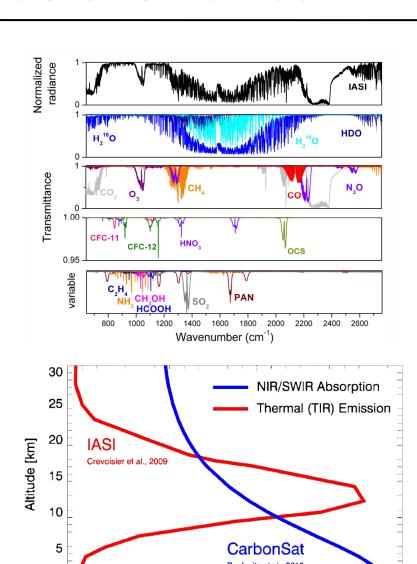
Current and Planned GHG Missions



Over the next decade, a succession of missions with a range of CO_2 and CH_4 measurement capabilities will be deployed in both polar and geostationary orbits

Thermal IR Sounders for GHGs

- CO₂ and CH₄ absorption is also present in the thermal infrared part of the spectrum
- The light source is the emission from the Earth's surface and not the Sun -> measurements possible during both day and night
- Measurement of atmospheric gases requires thermal contrast to the surface thus peak sensitivity is in free troposphere with little sensitivity to boundary layer
- Sensors: ESA IASI, NASA AIRS and NASA TES



0.2

0.4

0.6

CO₂ averaging kernel [arb. units]

0.8

1.0

0.0

Summary

- Remote sensing from satellites allows measuring the global distribution of greenhouse gases → especially beneficial for regions poorly sampled by surface networks
- However, it is an indirect measurement so careful validation and calibration is needed to ensure the accuracy and precision
- We now have the first dedicated GHG missions in space (GOSAT, OCO-2) and we hope for a continuous presence in space in the future using a range of technologies (including active sensing)

Section 3:

Computer-based Activity

Main Goals of the Activity

- Visualize the main aspects of the global carbon cycle as observed by GOSAT such as global distribution and seasonal cycle of CO₂
- Compare to observations from a thermal-IR sounder (AIRS) and from an in-situ surface station
- Explain your observations and summarize them in brief
 Powerpoint presentation

Data Sources and Tools

- We will use GOSAT CO₂ (Shortwave-infrared) columns from the ESA Climate Change Initiative and analyse them with IDL
- AIRS thermal-infrared CO₂ data available from the NASA Giovanni web-portal
- NOAA surface in-situ data from the NOAA ESRL webpage

Seasonal Cycle for surface and total column CO2

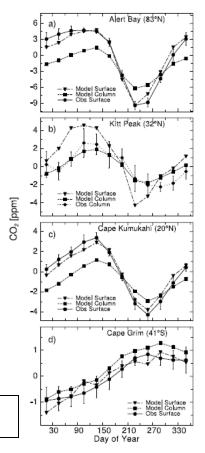


Figure 6. Modeled surface (triangles) and column (squares) $\rm CO_2$ mixing ratios at (a) Alert Bay, Canada, (b) Kitt Peak, USA, (c) Cape Kumukahi, USA, and (d) Cape Grim, Australia. At Alert Bay, Cape Kumukahi, and Cape Grim, surface measurements from the NOAA/CMDL network are shown with circles and standard deviation error bars. At Kitt Peak, data from Yang et al. [2002] for solar zenith angles less than 80° are shown with diamonds and standard deviation error bars. To construct the model estimate of the column at Kitt Peak, we sampled the model at levels above 790 hPa, corresponding to the height of Kitt Peak (2083 m).

Olsen and Anderson, JGR, 2006

Triangles: surface Square: Total column

Seasonal Cycle for total column and free-tropospheric CO2

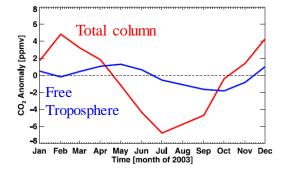
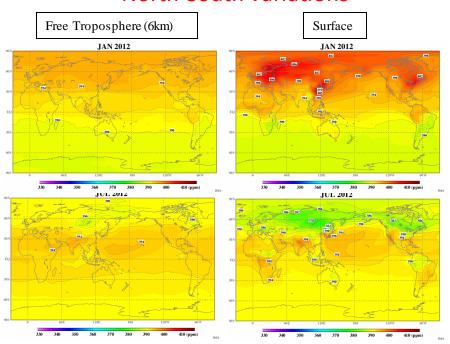


Figure 2. CO₂ anomaly over North America detected by SCIAMACHY (red) and AIRS (blue).

Barkley et al., GRL, 2006

North-South Variations



http://ds.data.jma.go.jp/ghg/kanshi/info_kanshi_e.html