

P. Prunet, O. Lezeaux, L. Chaumat, B. Tournier, E. Dufour, A. Klonecki  
NOVELTIS, France  
C. Camy-Peyret (LPMAA), F.-R. Cayla (SISCLE), T. Phulpin (CNES)

## Abstract

In the frame of a Research and Technology (R&T) study for the French Space Agency (CNES), NOVELTIS investigates the CO<sub>2</sub> retrieval accuracy for observations from space with different instrument types. The results obtained from the Infrared Atmospheric Sounding Interferometer (IASI) are presented here. The potential of CO<sub>2</sub> retrieval from IASI data is assessed, through the qualitative and quantitative analysis of two questions: expected accuracy of the CO<sub>2</sub> atmospheric concentration from the IASI infrared observation spectrum, impact of a specific cloud decontamination processing on the usefulness of the IASI CO<sub>2</sub> product. First results on the CO<sub>2</sub> retrieval accuracy and optimal CO<sub>2</sub> product design from the IASI spectrum are presented here.

A signal processing is developed to efficiently exploit the CO<sub>2</sub> information of the IASI spectrum, through Discrete Fourier Transform (DFT) filtering. Information content analysis and inversion experiments on simulated and real data are performed to assess the expected precision of retrieved CO<sub>2</sub> concentration, by taking into account the impact of the temperature, water vapour and ozone profiles uncertainties. This analysis shows that one can retrieve the mean atmospheric CO<sub>2</sub> concentration from a single IASI spectrum with a precision better than 1%, and demonstrate the possibility to derive CO<sub>2</sub> profile information (2 pieces of information). The powerful signal filtering properties of the DFT data processing appears decisive, as it allows to stabilize and make more robust CO<sub>2</sub> retrieval of the total content and profile information.

A CO<sub>2</sub> information content analysis and CO<sub>2</sub> retrieval simulations are done using the Optimal Estimation Method. That work demonstrates the capability of IASI to retrieve the CO<sub>2</sub> from a single IASI measurement with a precision of about 1% and a vertical profile of CO<sub>2</sub> on 2 atmospheric layers with a precision of 10-20%. It is also shown that the DFT method is decisive for a robust retrieval.

## CO<sub>2</sub> measurement requirements

Our current observing system of the global carbon cycle has a significant gap, as knowledge of the carbon cycle is based on sparse sampling on land, at sea and in the atmosphere. As a consequence, we cannot yet measure the components of the global carbon cycle with sufficient accuracy to balance the carbon budget. Improvements in the knowledge of the atmospheric CO<sub>2</sub> content, as well as in our understanding of the exchange mechanisms with sea and land surfaces, are therefore urgently needed for reliable predictions of the long-term anthropogenic increase of atmospheric CO<sub>2</sub>.

To address this issue, greater geographical and seasonal coverage of CO<sub>2</sub> measurements in the atmosphere is required. In order to identify sources or sinks of CO<sub>2</sub>, requirements of about 1% of the mean CO<sub>2</sub> mixing ratio over regional scales is stated (Rayner et al., 2001). The Infrared Atmospheric Sounding Interferometer (IASI) is one of the suitable instruments for monitoring atmospheric CO<sub>2</sub> from space. This study quantitatively explores the potential for IASI to derive atmospheric CO<sub>2</sub> information.

## CO<sub>2</sub> product definition

The determination of the IASI performance for CO<sub>2</sub> total content or profile retrieval has been done using the OEM formalism. The objective of the product definition is to design a CO<sub>2</sub> retrieval product able to optimise the information content provided by the IASI data and to exploit the (low) troposphere information as far as reasonably possible.

**Data-oriented product:** In the retrieval process, product information content comes from the data and from the a priori CO<sub>2</sub> information. In an optimal approach, this a priori is fixed by our best knowledge of CO<sub>2</sub> and it controls the proportion of information coming from the measurement itself (only the information improving the prior knowledge is used). Figure 3 illustrates how the data information is modulated by variation of the CO<sub>2</sub> a priori error. In particular, the number of pieces of information changes from 1 to 4 and the sensitivity to troposphere levels is increased when the prior error increases from 5% to 20%. In this study we use a 20% a priori error, which represents a good compromise between reasonable knowledge and full exploitation of the data signal.

CO <sub>2</sub> A priori error	5%	20%
DOFS	1.1	3.8

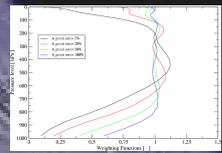


Figure 3: Degree of Freedom for Signal and Weighting functions of CO<sub>2</sub> retrieval from IASI spectrum obtained with different levels of a priori error.

## IASI measurements

IASI is dedicated to operational meteorology by measuring temperature and water vapour profiles in the lower atmosphere, as well as total content of trace gases such as CO, N<sub>2</sub>O, O<sub>3</sub>, CH<sub>4</sub> and CO<sub>2</sub>.

It will be on board the METOP satellite series in a sun-synchronous orbit and providing two measurements of a given Earth location per day. Individual IASI measurement is composed of 4 samples with a width of about 12 km and intervals of 25 km along and across track at nadir. The scan duration of eight seconds and the horizontal spacing of the full Earth views are identical to those of the AMSU-A instrument as shown in figure 1. The IASI spatial density is estimated to 1000 samples for a 10°x10° area.

IASI consists of a Fourier Transform Spectrometer based on a Michelson Interferometer, coupled to an integrated imaging system which allows characterisation of cloudiness inside the spectrometer field of view. The instrument measures the infrared spectrum emitted by the Earth and provides spectra of high radiometric quality at 0.5 cm<sup>-1</sup> spectral resolution from 645 to 2740 cm<sup>-1</sup> (see figure 2).

In this study, we considered IASI data obtained through a specific acquisition process: the external calibration mode. In this mode the scanning mirror is fixed (e.g., at the nadir position), allowing the measurement of consecutive spectra very close in space and time (216 ms between two measurements). This provides series of spectra measuring mainly the same surface and atmospheric conditions. Such data sets are useful to validate retrieval algorithms, verifying the processing stability and providing an empirical computation of the noise.

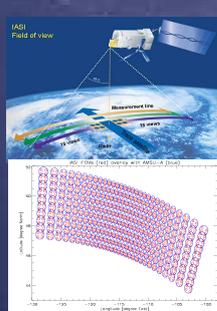


Figure 1: Spatial distribution of IASI and AMSU measurements

Model parameter	Error used in this study	IASI level 2 error
Temperature	1%	1.4%
Humidity profile	30%	10%
Ozone profile	80%	10-30%

Figure 2: 3-level profile CO<sub>2</sub> retrieval errors: a priori (black), total error (red), measurement error (green), smoothing error (blue) and model error (magenta).

**IASI CO<sub>2</sub> products:** 3 CO<sub>2</sub> products are considered from IASI: total content, 2-levels and 3-levels profiles.

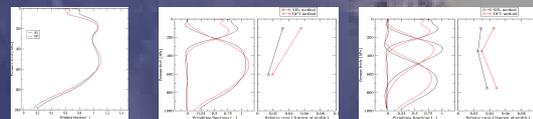


Figure 5: Weighting functions and relative errors of CO<sub>2</sub> products retrieved from IASI. When DFT data processing is used (red) or not (black).

## Data compression: DFT Method

The Discrete Fourier Transform (DFT) method is illustrated in Figure 2. The atmospheric spectrum measured by IASI is simulated with the 4A radiative transfer algorithm. It exhibits a quasi-periodic line structure in specific CO<sub>2</sub> spectral windows. Selected windows of the spectrum are re-sampled on a periodic base built from the theoretical spectral transitions of the CO<sub>2</sub> lines. Finally, the DFT applied on these spectral windows provides the pseudo data that is composed of the mean signal, the fundamental and harmonics.

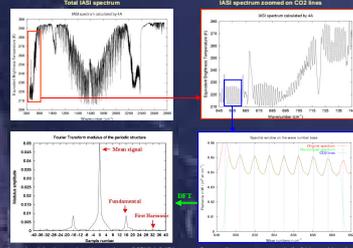


Figure 2: Description of the DFT method

The pseudo data jacobians (data sensitivity to CO<sub>2</sub>) are obtained by calculating the DFT of the IASI spectrum jacobians and the pseudo data noise is obtained by the standard deviation of the DFT over 2000 noisy spectra. The DFT was applied for 16 spectral windows that exhibit CO<sub>2</sub> absorption pattern (see table 1). The Fourier-space analysis method allows information merging by increasing the SNR with a factor N (number of window samples). The DFT processing is then equivalent to a data compression and allows to strongly reduce the computing time of calculations.

Window	DFT SNR	DFT SNR / N	Spectral SNR
W02	1502	142.3	1022
W05	1780	266.7	2050
W06	1279	126.7	2650
W07	1423	359.9	2950
W08	1952	354.4	3510
W09	9522	322.3	3546
W10	2917	308.8	2963
W11	3849	198.3	1927
W12	2958	277.6	2817
W13	850	88.8	344
W14	978	5.3	33
W15	1074	101	500
W16	1074	101	1031
W18	850	88.9	856

Table 1: DFT Signal to Noise Ratio (SNR)

## Data inversion: Optimal Estimation Method (OEM) formalism

**Model direct:**  
 • Radiative transfer model:  $y = F(x)$  (1)  
 • Linearisation around a priori  $x_0$ :  $y - F(x_0) = [F'(x_0)](x - x_0) + \epsilon$  (2)  
**Inverse problem:**  
 • Cost function minimisation:  $\chi^2 = [y - F(x)]^T R^{-1} [y - F(x)] + (x - x_0)^T B^{-1} (x - x_0)$  (3)  
 • Retrieval:  $x_a = x_0 + [F'(x_0)]^{-1} B^{-1} (x - x_0)$  (4)  
 $x_a = [I - G] x_0 + G x$  (5)  
**Error analysis:**  
 • Retrieval error:  $(I - G)^{-1} G \epsilon$  (6)  
 • Covariance matrix errors:  $A = D R D^T + [G - I] B [G - I]^T$  (7)  
 $A = A_m + A_s$  (8)

• True state  
 • a priori state (background)  
 • retrieved state  
 • measurement  
 • observation model  
 • measurement error  
 • jacobians  
 • measurement error covariance matrix  
 • a priori error covariance matrix  
 • contribution functions  
 • DFT  
 • overlying kernels (retrieval weighting functions)  
 • identity matrix  
 • retrieval error covariance matrix  
 • error due to measurement (noise)  
 • error due to a priori (smoothing error)

## Conclusions

A signal processing is developed to efficiently exploit the CO<sub>2</sub> information of the IASI spectrum, through Discrete Fourier Transform (DFT) filtering. Information content analysis and inversion experiments on simulated and real data are performed to assess the expected precision of retrieved CO<sub>2</sub> concentration, by taking into account the impact of the temperature, water vapour and ozone profiles uncertainties.

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## Perspectives

The validation on real IASI data has to be extended:  
 • on a significant number of IASI data in order to obtain an exhaustive validation of CO<sub>2</sub> retrievals on two and three levels  
 • with IASI data measured in coherence with independent measurements of CO<sub>2</sub>.  
 Then, one can study how it could be possible to improve the CO<sub>2</sub> retrieval in terms of precision or capability to detect sources or sinks of CO<sub>2</sub>. That could be done, for example by:  
 • spatial and temporal overages of CO<sub>2</sub> retrievals  
 • adding independent sources of information in order to improve CO<sub>2</sub> retrieval in the lower troposphere  
 • improving the knowledge of model parameters by using for example IASI level 2 products  
 • lower troposphere CO<sub>2</sub> retrieval by differential processing on heterogeneous scenes.

## CO<sub>2</sub> retrieval results

CO<sub>2</sub> total content and profiles are retrieved from series of real IASI spectra measured in external calibration mode. These retrieval experiments allow to validate the retrieval process robustness and to verify the theoretical error estimate.

**CO<sub>2</sub> total column retrieval:** Results of CO<sub>2</sub> total column amount (TCA) for 25 consecutive spectra are presented in Figure 6. The TCA is given in ppmv that represents the mean Volume Mixing Ratio (VMR) in the column. The results are very stable, and the variability is consistent with the theoretical error bars. The error is about 15%. Results are similar when using DFT processing (red) or not (black).

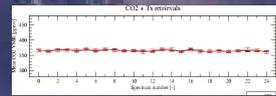


Figure 6: CO<sub>2</sub> total column retrieval (ppmv) for 25 consecutive IASI spectra, when DFT is used (red) or not (black).

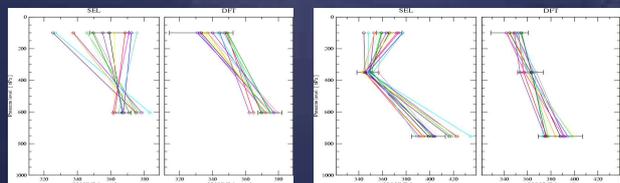


Figure 7: 2-level profile CO<sub>2</sub> retrieval (ppmv) obtained from 25 consecutive IASI spectra, when DFT is used (right panel) or not (left panel).

Figure 8: 3-level profile CO<sub>2</sub> retrieval (ppmv) obtained from 25 consecutive IASI spectra, when DFT is used (right panel) or not (left panel).

**CO<sub>2</sub> profile retrieval:** Results of CO<sub>2</sub> profile retrievals for 25 consecutive spectra are presented in Figure 7 (2-level profiles) and Figure 8 (3-level profiles). Both retrievals experiments illustrate the role of the DFT data processing for the stability of the retrieval, clearly indicating that the filtering properties of this processing is decisive for exploiting profile information from IASI data.

The error bars of the CO<sub>2</sub> profile elements are relatively large, however, about 10 ppmv for tropospheric CO<sub>2</sub> and 20 ppmv for stratospheric CO<sub>2</sub> in case of 2-level profile retrieval. Note however that these errors depend on the accuracy of temperature, humidity and ozone information used as inputs. This information is not optimal in our experiments, and should be greatly improved by using IASI level 2 products.