Atmos. Chem. Phys. Discuss., 10, 22725–22764, 2010 www.atmos-chem-phys-discuss.net/10/22725/2010/ doi:10.5194/acpd-10-22725-2010 © Author(s) 2010. CC Attribution 3.0 License.



This discussion paper is/has been under review for the journal Atmospheric Chemistry and Physics (ACP). Please refer to the corresponding final paper in ACP if available.

The use of IASI data to identify systematic errors in the ECMWF temperature analysis in the upper stratosphere

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Received: 21 June 2010 - Accepted: 8 September 2010 - Published: 5 October 2010

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Published by Copernicus Publications on behalf of the European Geosciences Union.

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Abstract

Since data from the Infrared Atmospheric Sounding Interferometer (IASI) became available in 2007, a number of papers have appeared in the literature which have reported relatively large discrepancies between IASI spectra and forward calculations in the centra of the CO. O branch at 667 cm^{-1} in this paper we arrue that these discrepancies

- ⁵ tre of the CO₂ Q-branch at 667 cm⁻¹. In this paper we argue that these discrepancies are primarily due to errors in the temperature profiles used in the forward calculations. In particular, we have used temperature profiles from the European Centre for Medium-Range Weather Forecasts (ECMWF) analysis to demonstrate that for the case study considered in this paper, these profiles are affected by systematic errors of the order of
- 7–10 K at the level of the stratopause. To derive the magnitude and the spatial location of the systematic errors in the temperature profile, we have carried out forward/inverse calculations for a number of clear-sky, daytime, IASI tropical soundings over the sea. The forward calculations have been performed using atmospheric state vectors which have been obtained either from the direct inversion of the IASI radiances or from space-
- time co-located profiles derived from radiosonde observations and from the ECMWF analysis. To rule out any effect due to the accuracy of the forward model, we have performed the forward calculations using two independent models. The sensitivity of the temperature biases to the variability of the CO₂ profile and to spectroscopy errors has also been studied.

20 **1** Introduction

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The Infrared Atmospheric Sounding Interferometer (IASI) is providing data of unprecedented spectral resolution and accuracy (see e.g. the recent ACP IASI special issue edited by Richter and Wagner, 2009). The assimilation of IASI radiances has produced a significant positive impact on forecast quality (e.g., Collard and McNally, 2009) and on the exploitation of trace gases information for atmospheric chemistry.

IASI has been developed in France by the Centre National d'Etudes Spatiales



(CNES) and is flying on board the Metop-A (Meteorological Operational Satellite) platform, the first of three satellites of the European Organization for the Exploitation of Meteorological Satellite (EUMETSAT) European Polar System (EPS).

Since the very early stages of the IASI data usage, the scientific community has
 observed a large discrepancy between IASI spectra and radiative transfer calculations (see, e.g., Fig. 1) at the centre of the CO₂ fundamental Q-branch at 667 cm⁻¹. This result has been documented in a number of unpublished presentations made during the second workshop of the EUMETSAT IASI Sounding Science Working Group (ISSWG-2) and in several papers published in the open literature, e.g. see
 Shephard et al. (2009); Matricardi (2009); Masiello et al. (2009).

In general, but especially in the spectral range around 667 cm⁻¹, the IASI datasets are of much improved quality and accuracy when compared to those from earlier space-borne Fourier transform spectrometers operating in nadir viewing mode, as shown, e.g. in Fig. 2. The high spectral stability and the absolute radiometric accuracy of the IASI instrument (e.g., see Straw et al., 2008; Illingworth et al., 2009)

- ¹⁵ curacy of the IASI instrument (e.g., see Straw et al., 2008; Illingworth et al., 2009) rules out the possibility that the large residuals discussed above are attributable to the instrument itself. In fact, as shown in Fig. 3, we found that large discrepancies between observations and simulations are also observed in the spectra of the Atmospheric Infrared Sounder (AIRS) instrument. In this case simulations were performed using the RTTOV (Matricardi et al., 2004) forward model and input fields obtained from
- the ECMWF short-range forecasts.

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Shephard et al. (2009) and Matricardi (2009) have suggested that the radiance bias at 667 cm⁻¹ could be caused by a wrong specification of the temperature profile in the upper stratosphere. Masiello et al. (2009) have provided further evidence connecting directly the radiance bias to errors in the temperature profile.

In the present paper we elaborate further on the results obtained by the above mentioned authors and give an explicit assessment of the radiance bias at $667 \,\mathrm{cm}^{-1}$ in terms of systematic errors in the temperature profiles. Specifically, we discuss errors in the ECMWF temperature analysis.



Several studies (e.g., see Fischer et al., 2008, and reference therein), suggest that roto-vibrational CO_2 lines could be affected by variations of the CO_2 volume mixing ratio in the mesosphere and lower termosphere and by non Local Thermodynamic Equilibrium (LTE) effects. These effects, if not properly accounted for, could result in large differences between observed and calculated spectra.

As far as non-LTE effects are concerned, the main reasons why they cannot be responsible for the observed bias at 667 cm⁻¹ is that biases are observed during nightime and daytime whereas, to a large degree, non LTE effects should only affect daytime radiances. It should also be observed that IASI is a nadir looking instrument and therefore it has a poor sensitivity to emission above the stratopause. Moreover, non-LTE effects in the CO₂ v_2 band are only important above 80 km.

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Regarding the issue of the variation of the CO_2 mixing ratio with altitude, we have explicitly assumed that CO_2 is not well mixed. To this end we have used ECMWF CO_2 profiles obtained from the assimilation of the Atmospheric Infrared Sounder (AIRS) (Engelen et al., 2009) radiances. Since we expect the CO_2 profiles to be affected

¹⁵ (Engelen et al., 2009) radiances. Since we expect the CO_2 profiles to be affected by temperature errors in the ECMWF model, we have carried out a comparison with a case of constant mixing ratio to check the sensitivity of the retrieval to the CO_2 profile.

The origin of the radiance bias could in principle be related to line-shape issues such as the effect of line-mixing. However, in that respect, it should be noted that, as shown

- ²⁰ by, e.g., Straw and Reuter (1988), the centre of the 667 cm⁻¹ Q-branch is much less affected by line-shape errors than the wings of the band. Line parameters (width and intensity) biases, if strongly localized, could generate biases characterized by a structure very similar to the one observed at 667 cm⁻¹. However, to our knowledge, there is no evidence that spectroscopic data are affected by biases of this nature and, at
- ²⁵ any rate, the convolution at the IASI spectral resolution of the monochromatic transmittances would tend to broaden the effect of strongly localized spectroscopic errors which is in contrast to what we observe at 667 cm⁻¹.

It should be said, however, that in our forward calculations, the treatment of the CO_2 absorption is made in terms of line and continuum components. The continuum



absorption at the centre of the $CO_2 v_2$ band displays a behaviour very similar to that displayed by the radiance bias (i.e. a very narrow and sharp structure). For this reason, we have studied the sensitivity of our results to the perturbation of the continuum absorption.

A recent validation study (von Engeln et al., 2009) performed using data from the 5 radio occultation (RO) GNSS (Global Navigation Satellite System) Receiver for Atmospheric Sounding (GRAS) instrument, shows biases in the ECMWF temperature profiles in the stratosphere which are qualitatively consistent with the biases discussed in this paper. Since GRAS data are not reliable above 5 hPa, it is not possible to use these data to corroborate our findings in the altitude range between between 30 and 10 60 km where we found the ECMWF temperature biases are most pronounced.

Given the difficulty (if not the impossibility) of a direct validation of the ECMWF temperature analysis in the upper stratosphere, we can gain some insight into the behaviour of the ECMWF temperature fields in this region by using the strato-

spheric/mesospheric temperature sounding channels of the Special Sensor Microwave 15 Imager/Sounder (SSMI/S) instrument. To this end, the statistics of the (largely negative) differences between observations and radiances simulated using profiles from the ECMWF analysis, suggests the presence of an increasing ECMWF temperature bias between 45 and 85 km (Bell, personal comunication, 2010). This finding is consistent with the results presented in this paper.

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It should be noted that the ECMWF analysis in the stratosphere is mainly driven by the assimilation of the Advanced Microwave Sounding Unit (AMSU) radiances. IASI (and AIRS) radiances in the center of the 667 cm⁻¹ Q-branch are not currently assimilated.

Regarding the IASI datasets, based on the work by Matricardi (2009); Shephard et al. 25 (2009); Masiello et al. (2009), it can be seen that biases at 667 cm^{-1} exhibit a very coherent pattern, i.e. a cold anomaly everywhere on the globe, that is, IASI is colder than the ECMWF-analysis-based radiative transfer calculations. It is important to stress how the biases at 667 cm⁻¹ do not display any day-night cycle (see e.g., Matricardi, 2009).



However, as exemplified in Fig. 1, it is evident that seasonal variations are present in the residuals. Figure 1 shows the residuals computed over a period of two weeks during the months of April, July, October, and, January 2008 using the experimental set up described in Matricardi (2009) (i.e. simulations have been performed using the RTTOV

⁵ forward model and ECMWF short-range forecasts fields of temperature, water vapour and ozone). Variations can be larger if the residuals are computed locally.

In this paper we study the origin of the biases at 667 cm⁻¹ using a few, earth-located, IASI spectra and good quality in-situ information which allows a consistent radiance closure experiment.

- ¹⁰ To this end, clear-sky, sea-surface, daytime IASI observations have been obtained from the Joint Airborne IASI validation experiment (JAIVEx) (Taylor et al., 2007), which was carried out in the US during April and May 2007. These IASI observations are complemented by a comprehensive ancillary data set to specify the state of the atmosphere corresponding to the IASI soundings.
- In this paper, IASI simulations have been performed using two forward models, σ -IASI (Amato et al., 2002; Grieco et al., 2007; Masiello et al., 2009) and the newly developed principal component based version of the RTTOV fast radiative transfer model (Matricardi, 2010). The strategy of using two independent forward models allow us to determine whether or not there is any dependence of the bias on the forward model it-
- ²⁰ self. The two forward models are based on different but recent versions of the LBLRTM line-by-line (LBL) radiative transfer model (http://rtweb.aer.com/) (i.e. v.11.6 for σ -IASI and v.11.1 for RTTOV).

For the inversion of the spectral radiances, we have utilized the δ -IASI (Carissimo et al., 2005; Masiello and Serio, 2004; Serio et al., 2009) package, which has been used for the simultaneous inversion of skin temperature, temperature, water vapour and ozone profiles.



2 Methodological background

The quality of the retrievals of atmospheric parameters can be assessed by a proper analysis of the spectral residuals. Once we get the final estimate of the atmospheric state vector, we can compute the corresponding fitted spectrum, say $\hat{R}(\sigma)$, where σ is

the wave number, and compare it to the observed spectrum, $R(\sigma)$. If F is the forward model function and \hat{v} the estimated state vector, then the spectral residual is

$$\delta R(\sigma) = R(\sigma) - \hat{R}(\sigma), \quad \hat{R}(\sigma) = F(\hat{\mathbf{v}})$$

If the spectrum is computed at *N* different wave numbers, σ_j , with j=1,...,N, then the spectral residual can be expressed as a vector of size *N*,

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$$\delta \boldsymbol{R} = (\delta R_1, \dots, \delta R_j, \dots, \delta R_N)^t$$

where the superscript t indicates transposition and

$$\delta R(\sigma_i) = \delta R_i$$

The spectral residual can be computed for any individual sounding. Therefore we add an index *i* to the residual vector, $\delta \mathbf{R}_i$, where *i* can run over the set of *n* available soundings.

2.1 The two forward models

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The radiative transfer calculations used for the radiance inversion have been performed using the ϕ -IASI package. This package incorporates a forward model, which we call σ -IASI, and a non-linear iterative inverse algorithm, which we call δ -IASI. In this way, we use a consistent methodology to perform a radiance closure experiment where a given first guess state vector is iteratively adjusted until convergence in the radiance space (i.e. the minimization of the spectral residuals) is reached.

The ϕ -IASI scheme has been described in several papers (Amato et al., 2002; Grieco et al., 2007; Masiello et al., 2009; Carissimo et al., 2005; Masiello and Serio, 2004; Serio et al., 2009). The reader can refer to these papers for further details.

rio, 2004; Serio et al., 2009). The reader can refer to these papers for further details Here we only describe those aspects which are relevant to the present analysis.



(1)

(2)

(3)

The σ -IASI module is a *monochromatic* radiative transfer model, which uses an appropriate atmospheric layering to model the optical depths. The layering consists of a grid of vertical layers of constant pressure. The discretized version of the radiative transfer equation, which is solved within σ -IASI, uses a 63-layers pressure grid which

- spans the range 1100–0.005 hPa. The 64 atmospheric pressure levels, which divide the atmosphere into 63 layers are shown in Fig. 4a. Note the relative higher density of layers at pressure levels just above the tropopause. This is an intentional (and general) choice and allows us to use the same model to simulate data recorded by instruments on board aircrafts flying at about 20 km altitude.
- ¹⁰ By using ϕ -IASI we can check the consistency of the forward/inverse calculations. The state vector retrieved by ϕ -IASI is then used as an input to RTTOV to check if the spectral residuals are consistent with those obtained using σ -IASI. The results can be used as an independent validation of the hypothesis that biases in the temperature profile are indeed responsible for the radiance biases at 667 cm⁻¹.
- ¹⁵ Of course, we expect to see differences between the σ -IASI and RTTOV calculations due to the different radiative transfer schemes and, above all, to the different pressure grid used to discretize the atmospheric state vector. In fact, RTTOV uses the 101-levels pressure grid specified by the AIRS science team. This is shown in Fig. 4b. In addition, the input to the σ -IASI model are layer mean temperatures, whereas RTTOV uses
- ²⁰ temperatures at the boundary of each layer. This means that the ϕ -IASI mean layer retrieved profiles have to be interpolated to grid point values and this process can introduce differences in the atmospheric state vector. These differences tend to increase in the upper atmosphere where both grids tend to become coarser (see Fig. 4).

However, what is important for our analysis is not to show which model is best, or which model produces the best fit to the data, but rather to show that both models display similar spectral residuals.



2.2 The JAIVEx and ancillary data

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The IASI spectra used in our analysis are daytime spectra measured during the 2007 JAIVEx campaign (see Taylor et al., 2007, for more details) over the Gulf of Mexico. We have a series of 6 spectra for the 29 April 2007, 16 spectra for the 30 April 2007, and

⁵ finally 3 spectra for the 4 May 2007. The total of 25 soundings are well collocated with dropsonde observations. The spectra where recorded in clear sky conditions, selected on the basis of either high resolution satellite imagery from the Advanced Very High Resolution Radiometer (AVHRR) on MetOp and in-flight observations. The spectra for the 29 April 2007 were measured at nadir whereas the other spectra were measured at a viewing angle of 22.50°.

Dropsonde information for temperature and water vapour extends up to 400 hPa. In order to compare IASI observations with forward model calculations we require the knowledge of the thermodynamic state of the atmosphere well above 400 hPa (IASI spectra are recorded at the top of the atmosphere). For this reason, the dropsonde observations were extrapolated to 0.1 mbar (corresponding to about 65 km) using the ECMWF analysis. For illustrative purposes, the ECMWF merging with dropsonde data is shown for one day in Fig. 6.

ECMWF CO_2 profiles obtained from the assimilation of AIRS radiances were also used in this study. The CO_2 vertical profiles were interpolated in space and time to the 25 IASI soundings. The CO_2 vertical profiles are shown in Fig. 5.

Our forward calculations require a further extrapolation of the state vector to 0.005 hPa and the inclusion of vertical profiles of additional trace gases. These were set to climatological values using the compilation by Anderson et al. (1986). The same compilation was used to extrapolate the state vector to the top pressure level at 0.005 hPa.

It should be stressed that the correct specification of the additional trace gases is of little relevance for the spectral range 645 to $700 \,\mathrm{cm}^{-1}$, which is dominated by CO₂ absorption. Because this range is completely insensitive to the lower troposphere,



the radiative transfer is completely governed by the temperature and $\rm CO_2$ mixing ratio profiles.

3 Spectral residuals using the state vector from dropsonde and ECMWF analysis

⁵ Figure 7 shows the spectral residuals in the range 645 to 700 cm⁻¹. These were obtained by computing synthetic IASI spectra using the forward model *F* and the state vector $\hat{\mathbf{v}}$ which consists of dropsonde observations extrapolated to the upper atmosphere using the ECMWF analysis. In Fig. 7 the spectral residual has been averaged over the total of 25 IASI soundings. The $\pm 1\sigma$ error bars are based on the IASI level 10 1C radiometric noise. The error bars applies to one single IASI spectrum and they are

shown here as a reference against which to compare the magnitude of the residuals. Figure 7 shows that the spectral residuals follow very closely the spectral signature of the CO_2 lines. However, apart from the core of the CO_2 Q-branch at 667 cm⁻¹, where the residual exceeds the noise level of a factor ten and more, the difference between observed and calculated spectra is usually below the IASI radiometric noise.

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The residuals are largerly independent of the forward model. In fact, Fig. 7 also shows the RTTOV residuals obtained using the same state vector. It can be seen that the two forward models agree very well. They display very similar patterns with large residuals at 667 cm^{-1} .

²⁰ Regarding the residuals at 667 cm⁻¹, it can be seen that RTTOV exhibits a slightly lower bias, which means that RTTOV is slightly colder than σ -IASI at 667 cm⁻¹. This result can be explained in terms of the different pressure grid and the interpolation process involved in the specification of the state vector on the RTTOV levels. In fact, because of the interpolation, the RTTOV-gridded temperature profile is slightly colder than the σ -IASI-gridded profile around the stratopause level. This is exemplified in Fig. 8, which compares the temperature profile originally defined on the σ -IASI grid

with the profile interpolated to the RTTOV grid.



The 667 cm⁻¹ Q-branch is sensitive to temperature values that cover a wide range of altitudes. In Fig. 9 we show the temperature Jacobian for the spectral range 645 to 700 cm⁻¹. It can be seen that the radiance (mostly evident at the centre of the Q-branch) is sensitive to changes in the temperature profile at altitudes between 30 and 60 km, an exceedingly wide range. If the radiance bias is attributable to temperature errors, this means that in order to produce the large residuals we see in Fig. 7, the temperature profile has to be in error almost everywhere between 30 and 60 km.

4 Quantifying the systematic error in the ECMWF analysis for temperature

The high quality of the IASI spectra (this includes the spectral range around the CO₂
 Q-branch at 667 cm⁻¹) allows us to perform an in depth analysis to assess whether or not the large discrepancies at 667 cm⁻¹ can be attributed to errors in the temperature profiles.

To this end we have performed the direct inversion of the 25 IASI spectra using the model δ -IASI (Carissimo et al., 2005; Masiello et al., 2009). When performing the retrievals, the non-linear inverse problem is initialized with a state vector which is derived by Empirical Orthogonal Functions (EOF) regression (Masiello and Serio, 2004; Serio et al., 2008, 2009). Thus, the final inverted state vector dependends only on the IASI spectral radiances and is totally independent of the ECMWF analysis.

The retrieval scheme performs the simultaneous inversion of the skin temperature, temperature, water vapour (mixing ratio) and ozone (mixing ratio) profiles. The spectral

²⁰ temperature, water vapour (mixing ratio) and ozone (mixing ratio) profiles. The spectral regions used in the inversion is shown in Fig. 10. It is important here to stress that we do not make use of the CO₂ v_3 -band because of non-LTE effects. In fact, the 25 IASI soundings have been recorded during daytime.

As discussed in the previous sections, when performing the iterations that lead to the final retrieval, the δ -IASI utilizes forward calculations performed using the direct model σ -IASI. For this reason, we expect a high degree of consistency between the residuals and the state vector obtained from a retrieval scheme that uses the same



forward model. Therefore, we have made an independent assessment of our results by computing the RTTOV residuals (IASI-RTTOV) using the same inverted state vector, $\hat{\mathbf{v}}$, obtained from the δ -IASI inversion.

Before moving to the analysis of the spectral residual, we want briefly discuss the
retrieval accuracy achieved by δ-IASI. Figure 11 shows the root mean square of the difference between retrieved and dropsonde/ECMWF profiles. In the pressure range 1025 to 400 hPa, where we have information from co-located dropsondes, it can be seen that the errors are close to 1 K and they are comparable to the errors that are expected based on simulated retrieval exercises. Note that the root mean square difference is computed over 25 profiles, so that statistical fluctuations are still expected to play a significant role. Bearing this in mind, the good agreement between inversions and dropsonde provide some more confidence in the inverse scheme as far as

its accuracy is concerned.
 A good retrieval accuracy for temperature is also achieved in the range 400 to
 15 ≈10 hPa, where we have information from the ECMWF analysis alone. However in the range 10 to 0.1 hPa, we can see that the computed root mean square difference is

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far from the expected value, especially at the stratopause level. Coming back to the spectral residuals, we now see that the use of the retrieved state vectors greatly improve the spectral residuals, which are now smoother and smaller in magnitude, as shown in Fig. 12. In this figure we have used the same scale used in Fig. 7 to allow the reader a more direct comparison.

It is quite evident that the difference at 667 cm^{-1} has been reduced by almost one order of magnitude. Furthermore, the wave-like pattern introduced in the residuals by the regular spacing of CO₂ lines (which is clearly evident in Fig. 7) has almost disappeared. The two forward models used in this study yield very similar results. In fact, both models respond in the same way to the new input state vectors.

Based on these results and on the arguments presented in the previous sections, we suggest that the residuals observed around $667 \,\mathrm{cm}^{-1}$ are most likely due to the inconsistency of the temperature profile in the upper stratosphere.



To estimate the errors of the ECMWF temperature profiles, we can compare the retrieved temperature profiles with those obtained from the dropsonde/ECMWF. Figure 13 shows that the two sets agree almost everywhere within $\approx \pm 1$ K with the exception of the upper atmosphere above ≈ 30 km, where they start do diverge.

⁵ An analysis of the average difference between the two set of profiles is shown in Figs. 14 and 15. From these two figures we can see that a marked difference begins to develop below the stratopause and reaches its maximum at the stratopause level, where the difference in temperature reaches a value of about 7 K.

Although these results only apply to the location of the soundings considered in this study, if we accept the conclusion that radiance errors are indeed related to temperature errors, then the global and consistent nature of the radiance bias at 667 cm⁻¹ suggests that errors in the ECMWF temperature analysis in the stratopause are also distributed globally. Given the geographical variability seen in the radiance residuals, we can assume that the local error patterns are likely to differ from those discussed above.

To conclude this section, we note that most of the radiance residuals discussed in the paper have been computed utilizing analysis and forecast temperature fields generated using version 33R1 of the ECMWF model (the so-called cycle 33R1 of the ECMWF Integrated Forecast System (IFS) which was operational until October 2008).

- At the time of writing, the operational version of the ECMWF model is 36R1. This version includes a number of upgrades which could in principle affect the quality of the temperature fields and potentially change the conclusions reached in the paper. Consequently, analogously to what has been done to produce the results shown in Fig. 1, we have computed radiance residuals for a period of two weeks during the
- ²⁵ month of April 2010 using the new ECMWF cycle. The April 2010 residuals at 667 cm⁻¹ (not shown here) differ very slightly from those obtained during April 2008 using the old ECMWF model. This allows us to conclude that the quality of the ECMWF temperature analysis in the stratopause has not changed substantially since 2008.



4.1 Sensitivity to potential interfering factors

4.1.1 CO₂ volume mixing ratio

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To better understand how the results of our inversions depend on the CO₂ mixing ratio profile, we have performed a further retrieval exercise where the CO₂ mixing ratio is assumed to be constant.

To this end we have assumed a constant mixing ratio of 385 ppmv. This is the global average value for April 2007 according to the NASA Earth System Monitoring Laboratory (Global Monitoring Division, e.g. see http://www.esrl.noaa.gov/gmd/ccgg/trends/). Figure 16 shows the average value of the difference between the retrieved and the ECMWF temperature profile, obtained for the cases where

- 1. the inverted profiles is obtained with the ECMWF-CO₂-mixing-ratio shown in Fig. 5 (hereafter this difference will be referred to as $\delta T_{ecmwf-CO_2}$),
- 2. the inverted profiles is obtained with the constant mixing ratio for CO₂ (hereafter this difference will be referred to as $\delta T_{constant-CO_2}$)
- ¹⁵ From Fig. 16 it can be seen that the results are very similar. It is worth noting that when we consider the direct difference between the inverted profiles, that is $\delta T_{\text{constant-CO}_2} \delta T_{\text{ecmwf-CO}_2}$, the larger difference is attained in the upper atmosphere. However, this difference is smaller than 1 K.

The results shown in Fig. 16b can also be interpreted as the bias that would affect the inverted profile if we overestimate the CO_2 mixing ratio in the upper atmosphere.

This can be demonstrated using a direct sensitivity analysis where we compute the derivative of the temperature profile with respect to the mixing ratio profile of CO_2 . This analysis, which will be illustrated below, shows that the sensitivity to the CO_2 perturbation is less than 1 K, if we assume a variation of the CO_2 mixing ratio profile of ± 10 ppmv.



According to Carissimo et al. (2005), the derivative of the estimated temperature profile vector with respect to CO_2 can be computed as

$$\frac{\partial \hat{T}}{\partial \boldsymbol{q}} = (\boldsymbol{K}\boldsymbol{S}^{-1}\boldsymbol{K} + \lambda\boldsymbol{B}^{-1})^{-1}\boldsymbol{K}\boldsymbol{S}^{-1}\boldsymbol{K}_{q}$$

where \hat{T} is the estimated temperature profile vector, \boldsymbol{q} is the CO₂ mixing ratio profile, \boldsymbol{K} is the derivative matrix (or Jacobian) of the radiance with respect to the temperature profile, \boldsymbol{K}_q the derivative of the radiance with respect to the CO₂ mixing ratio profile, \boldsymbol{B} is the background a-priori covariance matrix, \boldsymbol{S} is the observational covariance matrix and λ is an adaptive smoothing parameter, which is internally generated by δ -IASI according to the so-called L-curve criterion Hansen (1992).

It is usually assumed that CO_2 is well mixed in the atmosphere. However, there is strong evidence that this assumption leads to an overestimation of the CO_2 mixing ratio in the stratosphere. Consequently, in this paper we analyze the effect of overestimating the CO_2 profile in the stratosphere.

To this end, let us consider the case in which we perform the inversion for temperature assuming a constant value for the CO_2 mixing ratio. Assuming that the ECMWF analysis for the CO_2 mixing ratio (shown in Fig. 5) provides the correct profile, we have that the CO_2 constant mixing ratio profile is in error by a quantity, δq , which, on average, can be estimated by

$$\delta \boldsymbol{q} = \langle \boldsymbol{q}_{\text{ecmwf}} \rangle - \boldsymbol{q}_{\text{o}}$$

²⁰ where q_0 is the constant mixing ratio vector, whose elements are all equal to 385 ppmv. The bias, δT , which results from having assumed a constant value for q is given by

$$\delta T = \frac{\partial T}{\partial q} \times \delta q$$

For the case considered in this paper, this bias is shown in Fig. 17, where we see that although the largest value is to be expected in the upper part of the atmosphere, it is



(4)

(5)

(6)

still smaller than 1 K. It is also important to note that if we overestimate the CO_2 mixing ratio (as we have done here), we obtain positive increments, which would reduce the differences between ECMWF and our retrieval.

Comparing Fig. 17b to Fig. 16b we see that the sensitivity analysis yields almost exactly the same results we have obtained by considering the difference between the inversion analysis performed assuming a variable and a constant CO₂ mixing ratio.

The opposite situation, where the correct CO_2 mixing ratio is assumed to be constant with altitude and we perform the inversion analysis with the ECMWF-altitudedependent CO_2 mixing ratio, would differ only in the sign of the bias since the analysis is linear.

However, irrespective of the sign, the magnitude of the temperature bias at the stratopause level resulting from a perturbation of the CO_2 mixing ratio by ±10 ppmv, is no greater than ±1 K, which is too small to explain the radiance bias in the CO_2 Q-branch.

15 4.1.2 Spectroscopic parameters: the CO₂ continuum

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The current accuracy of the spectroscopic line parameters (line width, position and intensity) is difficult to assess, although based on the most recent data (e.g., HITRAN compilation) we do not expected that spectroscopic errors can result in the large bias shown in Fig. 7.

- ²⁰ However, the treatment of the CO_2 continuum absorption is a potential source of uncertainty. In the present work, the the CO_2 absorption is modeled using the LBLRTM scheme (Shephard et al., 2009). According to this scheme, the CO_2 absorption is split in two additive components, the line and continuum absorption. The behaviour in the far-wing of the line is described by the continuum component. In LBLRTM v. 11.6
- ²⁵ (http://rtweb.aer.com/), the continuum absorption is modeled in terms of a spectral density function, $\tilde{f}(\sigma)$ which is independent of temperature and pressure. This function is shown in Fig. 18a where it can be seen that it exhibits a very narrow peak at the centre of the 667 cm⁻¹ CO₂ Q-branch.



Because IASI radiances are colder than calculations in the centre of the band (see, e.g., Fig. 7), we might argue that we have an excess of continuum absorption around $667 \,\mathrm{cm}^{-1}$.

To test this hypotesis, we have performed the computation of the sensitivity of the inverted temperature profiles to a perturbation of the CO_2 continuum absorption using the same approach described in the previous section. The derivative of \hat{T} with respect to \tilde{f} (assumed here to be a function of the wave number σ) can be written as

$$\frac{\partial \hat{T}}{\partial \tilde{f}} = (KS^{-1}K + \lambda B^{-1})^{-1}KS^{-1}K_f$$

where now K_f is the Jacobian with respect to the function \tilde{f} . Note that since the spectral density function $\tilde{f}(\sigma)$ does not depend on the temperature profile, the derivative function can be easily integrated along the vertical, therefore the matrix K_f is a diagonal matrix, of size *N* by *N* where *N* is the number of spectral radiances.

Also, note that the derivative matrix (7), is a N_L by N matrix, where N_L is the number of atmospheric layers. For more details on the properties of the jacobian with respect to the continuum absorption see, e.g., Serio et al. (2008a).

If we vary the wave number dependent density function by the constant value $\delta \tilde{f}$ we should observe a bias in temperature, δT given by

$$\delta T = \frac{\partial \hat{T}}{\partial \tilde{f}} \times \delta \tilde{f}$$

15

Figure 18b shows the results for the case where we vary the continuum density func-

tion by -10% and -90%, respectively. As it can be seen from Fig. 18b, the resulting temperature bias tends to be larger in the troposphere, and even in the case where the reference value is reduced by 90%, the bias in the upper part of the atmosphere would still be smaller than 1 K.



(7)

(8)

5 Conclusions

We have performed a retrieval of the atmospheric state using IASI data during the month of April 2007. Large discrepancies have been observed between measured and simulated IASI radiances at the center of the fundamental CO_2 Q-branch at 667 cm⁻¹.

⁵ For the soundings considered in this paper we provide compelling evidence that the origin of these discrepancies is attributable to errors in the ECMWF temperature fields in the upper stratosphere, above the altitude of ≈30 km. The sign of the error in the temperature profiles is negative and its magnitude can reach 7–10 K at the stratopause and shows that IASI is actually sensing a colder upper stratosphere and lower meso-10 sphere than that represented by the ECMWF model.

We have shown that it is very unlikely that the radiance bias can be attributed to the forward radiative transfer model. Two different forward models, using different pressure grids and methodological approaches, yield consistent spectral residuals.

Since the radiance bias does not show any day/nigth variability, we can rule out the possibility that non-LTE effects might be responsible for it.

Because of the spectrally localized nature of the radiance bias, it is unlikely that the bias is a results of errors in the spectroscopic line parameters. The convolution at the IASI spectral resolution of the monochromatic transmittances would tend to impart a broad-like strucure to the bias which it is not actually seen.

- ²⁰ We have identified and investigated three potential sources of error, which could explain the radiance bias. These sources are
 - the temperature profile in the upper part of the atmosphere
 - the CO₂ mixing ratio variability with altitude
 - the CO₂ continuum absorption
- ²⁵ We found that even if we change the CO_2 continuum absorption by ±90%, this would affect the retrieved temperature profile by an amount not greater than ±0.5 K. An overestimation by 10 pmv of the CO_2 mixing ratio in the upper part of the atmosphere would



result in a very similar temperature bias. In the latter case, the bias would be positive and therefore it would tend to compensate rather than accentuate the negative bias observed in the IASI radiances. Therefore, the most likely source of the radiance bias is to be attributed to errors in the temperature profile.

⁵ Although the temperature profile is the primary source of the observed bias, it is not the only source. The radiance residuals computed using the retrieved atmospheric state show that the bias at the center of the 667 cm⁻¹ Q-branch is still different from zero. However, it is now reduced to a magnitude that is typical of biases seen in other spectral regions. This result suggests that there is nothing fundamentally wrong with the spectroscopy in the 667 cm⁻¹ Q-branch.

To conclude, we have shown that the use of radiances at the centre of the strong 667 cm^{-1} Q-branch of CO₂ offers a formidable tool for the remote sensing of the temperature in the upper stratosphere. Since the use of radiances in this spectral region allows us to probe the atmospheric temperatures for a wide range of altitudes between 30 and 65 km, the fundamental CO₂ Q-branch at 667 cm⁻¹ could be used to study, e.g., long-term warming or cooling tendencies of the upper stratosphere. As Fig. 2 suggests, such kind of study could be performed by the re-analysis of IMG data.

Acknowledgements. IASI has been developed and built under the responsibility of the Centre National d'Etudes Spatiales (CNES, France). It is flown onboard the Metop satellites as
 part of the EUMETSAT Polar System. The IASI L1 data are received through the EUMETCast near real time data distribution service. We thank Stuart Newman (Met Office) for providing the JAIVEx data. The JAIVEx project has been partially funded under EUMETSAT contract Eum/CO/06/1596/PS. The FAAM BAe 146 is jointly funded by the Met Office and the Natural Environment Research Council. The US JAIVEx team was sponsored by the National
 Polar-orbiting Operational Environmental Satellite System (NPOESS) Integrated Program Of-

fice (IPO) and NASA.



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20

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	ACPD 10, 22725–22764, 2010			
	IASI data to evidence ECMWF temperature biases G. Masiello et al.			
5				
	Title Page			
5	Abstract	Introduction		
-	Conclusions	References		
	Tables	Figures		
	14	۶I		
	•	•		
-	Back	Close		
	Full Screen / Esc			
200	Printer-friendly Version			
	Interactive Discussion			
2				









Fig. 2. This figure illustrates how much more accurate the IASI spectra in the long wave CO_2 absorption band are in comparison with those measured by an equivalent, albeit ten years older, instrument, namely the Japanese IMG (Interferometric Monitoring of Greenhouse Gases, Kobayashi et al., 1999). The comparison focuses on the range 645 to 700 cm⁻¹. Panel **(a)** shows a set of sea-surface IMG spectra (see Masiello et al., 2003) recorded in the tropics; panel **(b)** shows an equivalent set of IASI spectra also recorded in the tropics; the panel **(c)** shows the averaged value of the spectra shown in panel (a) and (b), respectively. The good agreement between the mean values shown in panel (c) means that the variability seen in panel (a) is just random.











Interactive Discussion

Fig. 4. The definition of the atmospheric pressure levels used in (a) σ -IASI and (b) RTTOV.



Interactive Discussion



22751



Fig. 6. JAIVEx case study, 29 April 2007. The figure shows the temperature profiles obtained from dropsonde data and the upper atmosphere ECMWF analysis.





Fig. 7. Spectral residual averaged over the 25 IASI soundings. The input state vectors have been obtained by the dropsonde+ECMWF analysis. The residual has been computed based on the two forward models σ -IASI and BTTOV.

Interactive Discussion



Fig. 8. The interpolation of the temperature profile from the σ -IASI grid to that of RTTOV. This example shows that the interpolation process yields a temperature profile which is slightly colder at the stratopause level.





Interactive Discussion

Fig. 9. An example of the radiance derivative (Jacobian) with respect to the temperature profile in the range 645 to $700 \,\mathrm{cm}^{-1}$.



Fig. 10. The IASI spectral coverage and the spectral intervals (in red) used for the inversions of skin temperature, temperature, water vapour and ozone profiles.





Fig. 11. The root mean square difference between retrieved and dropsonde/ECMWF temperature profiles (black line). The figure also shows (red line) the root mean square error based on simulations. Panel **(a)** shows the altitude range where we have dropsonde observations, while panel **(b)** shows the altitude range where the temperature information is derived from the ECMWF analysis.





Interactive Discussion

Fig. 12. Same as Fig. 7, but now the input state vectors have been obtained by direct inversion of IASI data.

22758















Fig. 15. As fig. 14, but now the average difference (IASI retrieval-ECMWF) is shown).

Interactive Discussion



Fig. 16. Panel **(a)** shows the average difference (IASI retrieval-ECMWF) for temperature for the two inversion case studies: 1) constant mixing ratio for CO_2 and 2) with the ECMWF-altitude-dependent CO_2 mixing ratio, respectively. Panel **(b)** gives the difference between the two curves shown in **(a)**.











Fig. 18. Sensitivity analysis to the CO_2 continuum absorption. Panel **(a)** shows the spectral density function we have used as a reference (green curve) in our calculations along with the values of the same density function scaled down by 10% and 90%, respectively. Panel **(b)** shows the response in terms of temperature bias to a perturbation equal to the reference-scaled value.

