Replies to reviewers

We have changed the paper considerably by including additional TROPOMI data so that we now cover the period 26 November 2017 to 30 November 2018. This addresses some of the criticism from both reviewers and will hopefully make our study a better paper. We now show timeseries for the whole period as well as averages over February-May and September-November 2018.

We have addressed all comments from the two reviewers and have added our replies in red below.

Reviewer 1

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This manuscript describes the first testing of TROPOMI TCO3 NRT retrievals version v1.0.0 as provided by DLR in the CAMS system. They describe in detail the actual testing procedure that has been performed so far with intention to arrive at operational application of the TROPOMI O3 data within the CAMS system.

Even though significant biases have been detected in this early retrieval product, the authors show that once applied in the CAMS data-assimilation system the automatic bias correction scheme is able to remove a large portion of these biases, which then brings the TROPOMI data within magnitudes such that no deterioration, and

15 even a small improvement is obtained when compared to independent observations. Also this configuration shows the strength of having the monitoring capabilities in the CAMS system to be able to quickly assess potential issues in the retrieval product (already during commissioning phase). This is valuable information to the retrieval product developers.

I agree such careful assessment of any retrieval product is a very valuable application of the CAMS system.

- 20 However, the scientific interest of current testing may be limited, considering that the authors have clearly used a preliminary retrieval product (details, as will described in Loyola et al., 2019, are still "in preparation"), which is not expected to be used within the community. Hence, their assessment, even though very relevant for the developers of the retrieval algorithm and for its potential impacts when applied operationally within CAMS, may be of limited general interest to deserve documentation in a scientific publication of this kind. As result, the
- 25 number of figures could possibly be reduced in the main text, and shifted to supplementary material, with exception of a selection of key figures, for which the figure quality could be improved. Furthermore, the evaluation period (effectively only about three months of data) is really short and also, for instance, not including the austral spring, which makes it hard to make an overall judgement.

The early data are publicly available and are expected to be used by the community. They are not preliminary data and were processed with the same NRT algorithm as the normal NRT data after June 2011, only they were 're-processed' with this algorithm, i.e. not produced in NRT. We state that they were 're-processed with NRT algorithm' to stress that they were not produced with the offline algorithm. We have re-phrased this in the document and hope we make this clearer now.

The retrieval was well documented in the ATBD (http://www.tropomi.eu/documents/atbd, last access Jan 2019), which was last updated in October 2018. However, due to other priorities a respective manuscript Loyola et al. (2019b) has not been published yet.

S5P/TROPOMI Total Ozone ATBD Rob Spurr, Diego Loyola, Michel Van Roozendael, Christophe Lerot, Klaus-Peter Heue, Jian Xu: S5P-L2-DLR-ATBD-400A, issue 1.6, 2018-10-17

We now state in section 2.2:

40 "For the work in this paper we use NRT TROPOMI TCO3 data (Loyola et al.; 2019b). These include TROPOMI data (V1.0.0) for the period 26 November 2017 to 3 May 2018 V1.0.0 that were reprocessed with the NRT algorithm and NRT TROPOMI data V1.0.0-V1.1.2 for the period 11 June to 30 November 2018 (see Table 2). No data were acquired at ECMWF from 4 May to 10 June 2018 for technical reasons. The TROPOMI TCO3 retrieval is based on the GDP 4.x algorithm original developed for GOME (van Roozendael et al., 2006), adapted to SCIAMACHY (Lerot et al., 2009) and further improved for GOME-2 (Loyola et al., 2011; Hao et al., 2014). The major TCO3 algorithm updates for TROPOMI compared to the heritage algorithms used for GOME-2 are the more precise treatment of clouds as scattering layers (Loyola et al., 2018), an optimized wavelength for the calculation of air mass factors

- 5 (328.2 nm instead of 325.5 nm), better a-priori ozone profile information (including the tropospheric climatology by Ziemke et al. (2011)) and a destriping correction. This destriping correction was introduced because total vertical ozone columns showed small striping structures. The correction factor is based on the ratio between the mean for individual rows and the mean for all rows over a certain region and period. We averaged the total columns within the tropics for January to April 2018 for both all 450 rows individually and over all 450 rows,
- 10 resulting in an array of 450 numbers, ranging between 0.99 and 1.015. Multiplying the VCD with the correction factor changes the result by about ±1%. The correction factor has been rechecked but no update seemed necessary up to now. The TROPOMI retrieval is described in the S5P/TROPOMI Total Ozone ATBD (Spurr et al., 2018)."

Consequently. the description of the procedure to introduce new satellite instruments in the CAMS system is still valuable information, but may fit better in a GMD-type of publication.

Furthermore, the authors conclude that the TROPOMI data do not degrade the ozone in the current configuration and therefore are intending to include full assimilation of TROPOMI NRT TCO3 data in the operational CAMS analysis soon. Their argument is that this adds redundancy and resilience in case that some of the older instruments stop working. Here I have severe problems. It is true that the significant biases, as

- 20 visible from the current, preliminary, version of the retrieval algorithm are more or less efficiently removed in the full data-assimilation system, but this is exactly owing to the presence of the existing observation system, including, for example, MLS and OMI onboard of AURA, which has already exceeded its foreseen lifetime. When these observations stop to be delivered, the bias correction algorithm may not work as efficiently, giving more weight to the (currently erroneous) TROPOMI retrievals. The magnitude of this effect has not been evaluated.
- 25 Hence, to validate their statement that adding TROPOMI with its current retrieval algorithm indeed adds the necessary resilience I suggest the authors to include two additional sensitivity experiments:

One where observations from (for instance) the AURA instrument (MLS and OMI) are no longer included, and also no TROPOMI data is included. One without the AURA observations, but now including TROPOMI observations to take over.

30 Such a study would indeed make a clearer case as to resilience of the system in the case of a sudden failure of these important instruments in the CAMS system, which would be a valuable assessment of the CAMS system that is also of quite more scientific interest.

TROPOMI will not be able to compensate for the loss of MLS O3 profiles which are very important in the CAMS ozone analysis (and we now explicitly state in this in the paper). We only claim TROPOMI will be a good

- 35 replacement for the currently used total column data (i.e. OMI or one of the GOME-2 instruments). We therefore do not think a test with/without MLS data is meaningful or within the scope of this paper. It addresses a completely different issue, i.e. the performance of the CAMS system when not assimilating height resolved O3 profile data. We know that without MLS the CAMS analysis can struggle to reproduce well the vertical ozone distribution.
- 40 We agree that we have not shown that TROPOMI can replace OMI (or GOME-2AB) one for one. The reason is that this paper is not supposed to be an observing system experiment paper, where we test the impact of each individual data set, but describes the inclusion of the new data into an existing system. As the CAMS system is an operational system it is always possible that data sets are not available for limited periods or instruments die and the analysis will change.
- 45 Because of time and limited computer resources it was not possible to run two further experiment for the whole period covered in this paper. We have however run the 2 suggested experiments for December 2017-April 2018 and now include an additional Figure (new Fig 16) that shows comparisions of these 2 new experiments, ASSIM

and CTRL with ozone sondes for FMA 2018. We do indeed not see a big impact if TROPOMI data are used without OMI (if anything, excluding OMI seems to slightly improve the fit to IAGOS at West African airports). On the whole, the differences between the experiments are small. As the quality of the TROPOMI data is better in the later part of 2018 than during these first months we do not expect that their assimilation would degrade the CAMS analysis if one of the other instruments failed.

We have therefore kept the statement in the paper but have added at the end of section 3.2.2:

"On the whole, the impact of the TROPOMI assimilation in the CAMS system is relatively small because the CAMS analysis is already well constrained by the other data sets that are assimilated routinely which are a combination of TCO3 data (OMI, GOME-2AB), O3 layers (SBUV/2, OMPS) and O3 profiles (MLS) (see Table 1). If

- 10 no other O3 data were available and only TROPOMI TCO3 data were assimilated the impact on the CAMS O3 analysis would be larger. To confirm that TROPOMI could serve as a good replacement if one of the older TCO3 instruments (OMI, GOME-2AB) failed two further experiments were run for the period 26 November 2017 to 30 April 2018: one mimicking the configuration of CTRL, but without OMI (CTRL-OMI) and the other mimicking the configuration of ASSIM without OMI (ASSIM-OMI). Compared to ozonesondes and IAGOS data the differences
- 15 between these experiments and ASSIM and CTRL are very small indeed. The largest differences between the four experiments are found in the SH midlatitudes when compared with ozone sondes (Figure 16a) and over West African airports compared with IAGOS (Figure 16b). Even here, the differences between ASSIM and ASSIM-OMI are small and both fit the independent observations better than CTRL and CTRL-OMI. There is even a sign that removing OMI leads to a small improvement in the fit to IAGOS over West Africa. In all other areas the
- 20 differences between the experiments with and without OMI were negligible when compared to sondes or IAGOS. These findings agree with results from longer observation system experiments that were carried out with the CAMS system for the years 2013 and 2014 in a different context (not shown) which showed only small changes to the CAMS O3 analysis if one of the TCO3 instruments was removed confirming that the CAMS analysis is well constrained and that there is some redundancy in the system. We are therefore confident that TROPOMI will be
- 25 able to counterbalance the loss of one of the older TCO3 instruments. Removing MLS O3 profiles has a much larger (negative) impact on the CAMS O3 analysis (e.g. Flemming et al., 2011) and TROPOMI would not be able to replace the MLS profiles as it does not provided data with similar vertical resolution."

More detailed comments

p1, l. 19 "agree well": I do not agree here: the TROPOMI data show biases wrt the CAMS system of up to 50 DU 30 locally. Please reformulate.

We now say:

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"The TROPOMI TCO3 data agree to within 2% with the CAMS analysis over large parts of the Globe between 60°N and 60°S and also with TCO3 retrievals from the Ozone Monitoring Instrument (OMI) and the Global Ozone Monitoring Experiment-2 (GOME-2) that are routinely assimilated by CAMS. However, the TCO3 NRT data from

35 TROPOMI show some retrieval anomalies at high latitudes, at low solar elevations and over snow/ice (e.g. Antarctica and snow-covered land areas in the Northern Hemisphere) where the differences with the CAMS analysis and the other datasets are larger. These differences are particularly pronounced over land in the NH during winter and spring (when they can reach up to 40 DU).."

p1, I.28 "less" should be "more"?

40 Yes, this has been corrected.

Abstract: this is too lengthy to my taste, and authors should try to condense. It doesn't need to be

complete.

The abstract has been shortened.

P1, I.39 (and also p11, I6): "After more tests": which kind of testing is meant here?

We have removed this statement as the data are by now actively assimilated in the operational CAMS system. This is now mentioned in the conclusion.

P2, I.34: the authors describe here the importance of the ozone hole in the earth system. This subject is however not covered in the assessment of the ozone assimilation experiment. The issue is that the reader is directed to wrong expectations.

The paper does now include data for the ozone hole period, so we have kept that sentence.

P3, I.7: the authors discuss the important issue of resilience of the system. However, in my opinion they don't fully test this in the current manuscript, see my comments above. Please consider revision of statements, or inclusion of additional sensitivity experiments.

10 Please see our comments to the more general statement above. We also changed the sentence to

"... system against the loss of any of the older instruments whose TCO3 retrievals are currently assimilated by CAMS...' to make clear that it would not be able to help with the loss of MLS.

P3, I.22: "Because the departures ...": I don't understand this sentence, please consider re-formulation.

We have rephrased this to: "Because the departures are smaller than the absolute observation values they show 15 up day-to-day changes better than when looking at the absolute model fields or observation values."

Introduction: While authors make the case for the importance of ozone assimilation in CAMS, I miss references to other examples where new satellite data has been tested in early phase, e.g. in terms of composition, or possibly meteorology.

The problem is that these early tests are usually not written up, because they are considered routine work. The

20 best ever at ECMWF was NOAA-16 AMSUA radiances that were assimilated just 5 weeks after launch but that was not written up as it was a routine operation. Probably the best example of completely new data in the ECMWF system would be AIRS where the system was trained with simulated data before launch to speed up the implementation. This is written up in https://onlinelibrary.wiley.com/doi/abs/10.1256/qj.04.171 but perhaps not entirely relevant for our study. As our study now uses a year worth of S5P data we do not think it is 25

necessary to include this reference.

P3, I.31: "are not too large": this sounds like a very subjective statement. Can this be quantified in any way?

We have rephrased this to small

P4, I.3: for more clarity, suggest to rewrite "... as originally implemented in..." or "... as originating from the Chemistry..." 30

We have changed it to: "... as originally implemented in..."

P4, I.30: here the authors state why the application of averaging kernels is not needed, either because they are not needed (having profile data as in MLS) or not available. This I find questionable, and I wonder if averaging kernel aspects could be important to reconciliate differences found between, for instance, the GOME-2 and

35 OMI retrievals as seen from Figure 5. At least, it would be good if the authors can back-up their statements with literature on the subject.

We have removed the sentence and now only state that averaging kernels are currently not used:

"Averaging kernels are currently not used for the assimilation of ozone retrievals in the CAMS system. It is planned to test their use in the future."

P6, I.12 "that all four instruments agree well": I find this statement with the current dataset a bit problematic, particularly when authors note differences in total columns of "up to 60 DU" (p6, I17). Please consider reformulation

We have rephrased the description of that Figure (now Fig. 3).

- 5 P6, I.30: "Tropics", "problem with the OMI retrievals": The signal appears actually mostly isolated over the tropical continents. Therefore, couldn't it be a sign of something physical, associated to tropospheric chemistry, which is indeed picked up in the OMI retrieval and not in GOME-2, e.g. because of different sensitivities towards the lower altitudes? Evaluation with independent data shows indeed a negative model bias over West Africa (Fig. 16), although the model also shows positive bias averaged over the tropics when evaluated against sondes
- 10 (Fig. 15). As bottom line, are you confident that the bias correction functioning properly when bias is removed from OMI and not from GOME?

The statement referring to a potential problem with the OMI retrievals has been removed.

P7, I.26: "they are less than 1% in the NH and SH", but this includes compensating errors, or? Please comment.

We have removed Figure 7 and instead now show a zonal mean timeseries of the differences in Figure 5 that
shows differences better by latitude. We also show mean biases and their standard deviations for 5 latitude
bands now (90-60N, 60-30N, 30N-30S, 30-60S, 60-90S) in Table 3 and 4 (were Table 2 and 3).

P7, I.37: about "60S and 50N" should be "about 60S and 40N".

We have re-done the Figures for FMA 2018 and SON 2018 and now say 60S-45N.

- P8, I.2: "destriping correction": although indeed a sensitivity to the scan position is shown, I find it confusing to refer to the 'destriping correction' here. I so far understood that this de-striping has been introduced to handle, for instance, row-anomaly issues with particular affected rows, as is the case with OMI, but not so much with changing signal towards the edges of the scan, which may require a more physical explanation in the retrieval algorithm. Can you comment?
- We do not observe a row anomaly up to now in the TROPOMI data, but besides that the reviewer is right the destriping correction was implemented to handle small scale variations that are observed for certain rows and are constant in time in principle it might also affect the edges. The row dependency found in the comparison to CAMS however is probably not caused by a systematic row dependency in the O3 columns. The TROPOMI data themselves are routinely quality controlled (http://mpc-l2.tropomi.eu/#o3, January 2019) and a systematic dependency was not observed.
- 30 The exact reason for the row dependency in the differences should be investigated in more detail; it might be caused by a shift in the position with the altitude. The maximum viewing zenith angle is 66.9° taking the earth's curvature into account the minimum elevation angle of the light being reflected to S5P is about 11.4°. At 12 km altitude, the difference to the central coordinate of the S5P ground pixel is about 59 km (1.5 CAMS grid cells). However, this does not explain why the ozone column decreases towards the edges, because the local column 35 might be both higher and lower. More work is needed to study this.

We have removed several references to the destriping correction from the manuscript and have added in section 2.2:

"This destriping correction was introduced because total vertical ozone columns showed small striping structures. The correction factor is based on the ratio between the mean for individual rows and the mean for all

40 rows over a certain region and period. We averaged the total columns within the tropics for January to April 2018 for both all 450 rows individually and over all 450 rows, resulting in an array of 450 numbers, ranging between 0.99 and 1.015. Multiplying the VCD with the correction factor changes the final result by about ±1%. The correction factor has been rechecked but no update seemed necessary up to now." P8, l.10, "blacklisting poleward of 60 degree". Seeing the emerging biases at 40 degree north, it would make sense to blacklist data from this latitude onwards, or?

Not necessarily. Because we see a lot of the problems at low solar elevations a blacklist based on latitude and SOE should work well. Also, the bias correction varies by latitude (because of the SOE parameter). Furthermore, the absolute TCO2 values are also larger path of 40N on the relative areas are still in a space where we see the

the absolute TCO3 values are also larger north of 40N so the relative errors are still in a range where we can try to use the data. The really bad outliers will be rejected by the first-guess check or given less weight by the variational quality control.

P9, l.1, "are less than 2%". This refers to the average bias for the 26 Nov – 3 May time period. But as is clear from Figure 10, there is only little data in the December-January time period, which means that the difference for this period with/without TROPOMI data is negligible. Therefore, I believe it is more meaningful to present &

report these biases for the 28 January – 3 May period, as done also in Figure 13.

We still want to show the biases for the complete period in Table 3 and 4 (were table 2 and3). However, as we now also have data after May we have split the statistics into the first part (26 Nov-3 May and the rest 11 June-30 Nov). For the average maps we now only show the periods Feb-April and Sep-Nov 2018.

15 P9,I.5: "26 November": Figure caption of Fig. 13 writes "28 January". Please check.

The Figure (now Fig10) now shows Feb-Apr and Sep-Nov and the caption has been adapted accordingly.

P9, I.10: "the impact would be larger": Yes, I agree, and this is worrying, particularly as the positive impact, seen so far, may no longer be the case. Could you please comment?

In our longer experiment the impact is still positive in the tropical troposphere, especially over West Africa, so we are not worried about this. Also, the new Figure 16 shows the small positive impact of TROPOMI (without OMI).

We have added in section 3.2.2:

"It seems the main advantage of assimilating TROPOMI into the CAMS system is the improvement of tropospheric ozone. This is due to the fact that MLS defines the stratosphere whereas OMI, GOME-2 and TROPOMI are also sensitive to the troposphere and add extra information here (see also Lefever et al., 2015).
Adding TROPOMI to the CAMS system fits the CAMS analysis better to independent tropospheric data."

P9, I.35 "observations"

Corrected

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P9, I.39: "Loyola et al., 2019": the current data-stream appears preliminary, considering that the algorithm description has not been published yet. This is important to stress.

30 The TROPOMI data in this study are not preliminary. See our reply to the more general comment above.

P10, I.20 "solar elevation": this seems only partly an appropriate predictor. Would the CAMS system be flexible enough to add different predictors in the system for its bias correction scheme, such as albedo?

The CAMS bias correction scheme is flexible enough to work with other parameters (e.g. for IASI CO retrievals thermal contrast between surface and lowest model layer is one of the predictors), but experiments would be needed to test this.

P10, I.34 "to add redundancy", This is actually not tested, please see my comments above. Please

comment.

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See our comment above regarding the new Figure 16.

Figure 10: Figure quality appears insufficient for publication, and legend seems incomplete. Please consider 40 improved legibility.

The quality of the Figure (now Figure 7) has been improved.

Reviewer 2:

The paper describes the outcomes of the assimilation tests in the CAMS system with Tropomi TCO3 v1.0.0 data. The paper properly explains the methods as well the input data used in this work. Presentation is clear and well structured. Proper acknowledgements are given to all authors as well as other data providers/sources.

The paper describes how CAMS assimilation system may be used to monitor bias as well as other measurement characteristics of a new instrument and thus, show how CAMS system may be used as an independent source of quality control. This may benefit both algorithm developers as well as data users.

The basic idea behind this work is not novel because the CAMS assimilation system has existed quite long time already. However, the Tropomi data itself is very interesting and can be seen as a step forward for the new instruments in future, like onboard EPS-SG platforms. The Tropomi instrument is in the afternoon orbit and thus, fulfils nicely data retrieved with morning instruments, like GOME-2 and other instruments in morning orbits. Thus, the topic of this paper is interesting indeed.

The paper show results over period 26th November to 3rd May 2018. Most of the figures show averaged values over the whole data period. However, the figures (like figure 7) indicate problems in L1 and L2 in December-January, which may be due to the early commissioning phase. Thus, the first data samples may not be at the same quality level than in Feb-April, which may have an effect to information content of the images showing averages of the whole period. Have you checked this? Thus, it would be interesting and useful to see a little bit more information about assimilation and control fields at certain fixed time steps.

20 We have increased the data period from 26 Nov 2017 to 30 Nov 2018 and now show timeseries for the whole period and averages for the periods February to April and September to October 2018 (July-September for comparison with IAGOS because of data availability). Thus the early problem periods in Dec 2017 and Jan 2018 do not affect the averages any more.

Furthermore, there are some other concerns at the same time. The first one is the length of the assimilation period from about December to April with several larger data caps. The data of about three months may not be well representative over the seasonal cycles, for example. Therefore, it is difficult to make conclusions beside February-April for the rest of the year.

Period is now from 26 Nov 2017 to 30 Nov 2018.

The second concern is about the TCO3 version v1.0.0. The current version is already 1.01.02 with improved OCRA and ROCINN as described by Loyola et al 2018. The retrieval algorithms for Tropomi are under fast development right now and thus, the results shown in this paper may be somewhat outdated already by now.

There are no big algorithm changes between the early data v1.0.0. and the current data v1.1.2, thus using the early data is meaningful. We do see some problems with the data during the commissioning phase but by extending the timeseries until the end of November 2019 we now use data from v1.0.0, v1.1.1, v1.1.2 giving more validity to the results.

The current version of the data-stream is not preliminary. The retrieval was well documented in the ATBD (http://www.tropomi.eu/documents/atbd , Jan 2019), which was last updated in October 2018. However, due to other priorities a respective manuscript has not been published yet.

S5P/TROPOMI Total Ozone ATBD Rob Spurr, Diego Loyola, Michel Van Roozendael, Christophe Lerot, Klaus-Peter Heue, Jian Xu: S5P-L2-DLR-ATBD-400A, issue 1.6, 2018-10-17

We have added in section 2.2:

35

"For the work in this paper we use NRT TROPOMI TCO3 data (Loyola et al.; 2019b). These include TROPOMI data (V1.0.0) for the period 26 November 2017 to 3 May 2018 V1.0.0 that were reprocessed with the NRT algorithm

and NRT TROPOMI data V1.0.0-V1.1.2 for the period 11 June to 30 November 2018 (see Table 2). No data were acquired at ECMWF from 4 May to 10 June 2018 for technical reasons. The TROPOMI TCO3 retrieval is based on the GDP 4.x algorithm original developed for GOME (van Roozendael et al., 2006), adapted to SCIAMACHY (Lerot et al., 2009) and further improved for GOME-2 (Loyola et al., 2011; Hao et al., 2014). The major TCO3 algorithm

- 5 updates for TROPOMI compared to the heritage algorithms used for GOME-2 are the more precise treatment of clouds as scattering layers (Loyola et al., 2018), an optimized wavelength for the calculation of air mass factors (328.2 nm instead of 325.5 nm), better a-priori ozone profile information (including the tropospheric climatology by Ziemke et al. (2011)) and a destriping correction. This destriping correction was introduced because total vertical ozone columns showed small striping structures. The correction factor is based on the ratio between the
- 10 mean for individual rows and the mean for all rows over a certain region and period. We averaged the total columns within the tropics for January to April 2018 for both all 450 rows individually and over all 450 rows, resulting in an array of 450 numbers, ranging between 0.99 and 1.015. Multiplying the VCD with the correction factor changes the result by about ±1%. The correction factor has been rechecked but no update seemed necessary up to now. The TROPOMI retrieval is described in the S5P/TROPOMI Total Ozone ATBD (Spurr et al., 2019)."
- 15 **2018)**."

Page 9, line 9-10 and page 10, lines 34-35: It's mentioned that if no other data is available, the effect of Tropomi data would be larger. This seems to be a justified conclusion indeed. Furthermore, according the paper, the main reason to assimilate Tropomi TOC3 v 1.0.0 and not to wait more mature data version is that the assimilation of Tropomi data as soon as possible would be beneficial in case of failure of older instruments.

20 However, to evaluate this properly, there should be assimilation tests where some other instruments are removed from the system. Otherwise, it may be difficult to support the argument because it's difficult to predict how CAMS model behaves when some other instruments are removed. I'm not expert in CAMS data assimilation and thus, some more evidence could be presented.

We have run 2 more experiments for some of the period (until the end of April 2018), one where TROPOMI was
assimilated and OMI was removed and one where both TROPOMI and OMI were removed. The results are shown in the new Fig 16. We have added:

"On the whole, the impact of the TROPOMI assimilation in the CAMS system is relatively small because the CAMS analysis is already well constrained by the other O3 data sets that are assimilated routinely which are a combination of TCO3 data (OMI, GOME-2AB), O3 layers (SBUV/2, OMPS) and O3 profiles (MLS) (see Table 1). If

- 30 no other O3 data were available and only TROPOMI TCO3 data were assimilated the impact on the CAMS O3 analysis would be larger. To confirm that TROPOMI could serve as a good replacement if one of the older TCO3 instruments (OMI, GOME-2AB) failed two further experiments were run for the period 26 November 2017 to 30 April 2018: one mimicking the configuration of CTRL, but without OMI (CTRL-OMI) and the other mimicking the configuration of ASSIM without OMI (ASSIM-OMI). Compared to ozonesondes and IAGOS data the differences
- 35 between these experiments and ASSIM and CTRL are very small indeed. The largest differences between the four experiments are found in the SH midlatitudes when compared with ozone sondes (Figure 16a) and over West African airports compared with IAGOS (Figure 16b). Even here, the differences between ASSIM and ASSIM-OMI are small and both fit the independent observations better than CTRL and CTRL-OMI. There is even a sign that removing OMI leads to a small improvement in the fit to IAGOS over West Africa. In all other areas the
- 40 differences between the experiments with and without OMI were negligible when compared to sondes or IAGOS. These findings agree with results from longer observation system experiments that were carried out with the CAMS system for the years 2013 and 2014 in a different context (not shown) which showed only small changes to the CAMS O3 analysis if one of the TCO3 instruments was removed confirming that the CAMS analysis is well constrained and that there is some redundancy in the system. We are therefore confident that TROPOMI will be
- 45 able to counterbalance the loss of one of the older TCO3 instruments. Removing MLS O3 profiles has a much larger (negative) impact on the CAMS O3 analysis (e.g. Flemming et al., 2011) and TROPOMI would not be able to replace the MLS profiles as it does not provided data with similar vertical resolution."

Several paragraphs/sentences associated to certain figures (like 4, 8, 11 and 13 etc) are very short. Thus, the analysis (text) and the figures don't seem to be in balance. Therefore, I would suggest that the authors should

reconsider the structure of the paper and put some of the paragraphs together, perhaps. Also, it could be useful to reconsider if all of those figures are necessary.

We have restructured the paper because of the longer time period and have also removed some of the Figures (i.e. previous Fig 2 and 3 are now combined in new Fig 3, Fig 6 is removed as the information is given in Table 3

6 (was table 2), Fig. 7 is removed and instead we show zonal mean hovmoeller plots of TROPOMI and differences with OMI and GOME-2Ab in the new Fig2, old Fig 8 is removed, Scatter plots against cloud cover and cloud top pressure have been removed. We also tried to put some paragraphs together.

Detailed comments:

Table 1: What is OMPS data version?

10 V1r0. This has been added to the table.

Page 3, line 20: It is difficult to see this as long term monitoring because the actual data period is about three months.

The period now covers a year from 26 Nov 2017 to 30 Nov 2018.

Page 4, line 8-10: A very short second paragraph in 2.1. Is it possible to merge this with the first paragraph in 15 2.1?

Done.

30

Page 6, line 18: "..is mainly lower..". This seems to be too general conclusion because the high max areas reach the latitude 65. There seems to be clear land-sea separation.

We have rephrased this: "The Figure shows that there are large differences between TROPOMI and GOME-2AB polewards of about 60° which seem to be mainly negative over ice and sea and positive over land."

Page 6, line 41: It would be better to use the version with the new climatology in this study.

This does not exist yet. It is planned to create a climatology from S5P data when a long enough record is available.

Page 7, line 1: ". . .small negative departures elsewhere. . .". There seems to be quite large negative departure over Antarctica but it's not mentioned here or before?

We are mentioning this now when looking at the new Figure 5: "During FMA (Figure 5b) TROPOMI is lower than the CAMS analysis south of 60° S and over land or snow/ice north of 60° N."

Figure 7, tables and texts: The latitudes are not consistent through the text. In fig 7 they are -70 – +70 whereas in tables 2 and 3 as -90 - +90. Furthermore, the active assimilation was done only within the latitude band of -60 - +60 and thus, the results in the Fig 7 could be different if the latitudes were restricted accordingly. Thus, the reason for different latitude bands should be explained (some are clear, some are not so).

Sorry for the confusion. We have removed Fig 7, so this is not an issue any more. We have also recalculated the statistics in Tables 2 and 3 (now Tables 3 and 4) for 5 latitude bands 90-60N, 60-30N, 30N-30S, 30-60S and 60-90S to bring them in line with the fact that we assimilate the data between 60N and 60S and to be able to
 calculate separate statistics for the polar regions where there are larger differences.

Page 7, line 30: "Small" is subjective term here. For example, 55N, the departure is about 10 DU. In general, to use 60N as a separation seems to be a little bit problematic because in several figures the actual separation could be 50N or 55N.

Figure 7 has been removed from the paper.

40 Figure 11 and Page 8, line 31-35: Is the swath angle dependency seen in tropics in the fig 11b?

No, this must have been an artefact of the colour scale and the averaging time period. We do not show the mean bias correction plots any more because they are not really meaningful as the bias correction changes with time. We still show the zonal mean timeseries of the bias correction.

Fig 12 b: Perhaps scale from -5 to 5 DU with 0.5 DU tics could work better.

5 We think the scale works well for the new averaging periods Feb-April and Sep-Oct 2018 and have kept it.

Page 9, line 33: Interesting to see this clear improvement

Yes, this is a nice result and is also seen in the new plots for July-Sept 2018. We stress this improvement more clearly in the text now.

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Differences between revised and original manuscript:

Monitoring and assimilation tests with TROPOMI data in the CAMS system: Near-real time total column ozone

Antje Inness¹, Johannes Flemming¹, Klaus-Peter Heue², Christophe Lerot³, Diego Loyola², Roberto Ribas¹, Pieter Valks², Michel van Roozendael³, Jian Xu² and Walter Zimmer²

¹ECMWF, Shinfield Park, Reading, RG2 9AU, UK

²German Aerospace Centre (DLR), Remote Sensing Technology Institute, Oberpfaffenhofen, 82234 Wessling, Germany ³BIRA-IASB, Brussels, Belgium

Correspondence to: Antje Inness (a.inness@ecmwf.int)

Abstract

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The TROPOspheric Monitoring Instrument (TROPOMI) on board the Sentinel 5 Precursor (S5P) satellite launched in October 2017 yields a wealth of atmospheric composition data, including retrievals of total column ozone (TCO3) that are provided in near-real time (NRT) and off-line. The NRT TCO3 retrievals (V1.0.0-V1.1.2) have been included in the data assimilation system of the Copernicus Atmosphere Monitoring Service (CAMS), and tests to monitor the data and to carry out first assimilation experiments with them have been performed for the period 26 November 2017 to <u>30 November 2018</u>. The TROPOMI TCO3 data agree to within 2% with the CAMS analysis over large parts of the Globe between 60°N and 60°S and also with TCO3 retrievals from the Ozone Monitoring Instrument (OMI) and the Global Ozone Monitoring Experiment-2 (GOME-2) that are routinely assimilated by CAMS. However, the TCO3 NRT data from TROPOMI show some retrieval anomalies at high latitudes, at low solar elevations and over snow/ice (e.g. Antarctica and snow-covered land areas in the

35 Northern Hemisphere) where the differences with the CAMS analysis and the other datasets are larger. These differences are particularly pronounced over land in the NH during winter and spring (when they can reach up to 40 DU) and come mainly from the surface albedo climatology that is used in the NRT TROPOMI TCO3 retrieval. This climatology has a coarser horizontal resolution than the TROPOMI TCO3 data which leads to problems in areas where there are large changes in reflectivity from pixel to pixel, e.g. pixels covered by snow/ice or not. The differences between TROPOMI and the CAMS analysis also show some dependency on scan position.

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-	Deleted: 3 May
	Deleted: TROPOMI was still in its commissioning phase until 24 April 2018. Nevertheless, the results show that, even at this early stage, the
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The assimilation of TROPOMI TCO3 has been tested in the CAMS system for data between 60°N and 60°S and for solar elevations <u>greater</u> than 10° and is found to have <u>a small positive</u> impact on the ozone analysis <u>compared to Brewer TCO3 data</u> and an improved fit to ozone sondes in the tropical troposphere and to IAGOS aircraft profiles at West African airports. The

5 impact of the TROPOMI data is relatively small because the CAMS analysis is already well constrained by several other ozone retrievals that are routinely assimilated. <u>Averaged over the periods February-April and September-October</u> 2018, difference between experiments with and without assimilation of TROPOMI data are less than 2% for TCO3 and less than <u>3% in the vertical for seasonal mean zonal mean O₃ mixing ratios, with the largest relative differences found in the troposphere.</u>

1 Introduction

- 10 The Copernicus Atmosphere Monitoring Service (CAMS, atmosphere.copernicus.eu) produces daily global near-real time (NRT) forecasts of atmospheric composition up to five days ahead and a range of other datasets on global and regional atmospheric composition, such as near-real-time estimates of fire emissions, reanalyses of atmospheric composition and greenhouse gas forecasts and analyses. To improve the quality of the global CAMS forecasts the initial conditions for some of the chemical species, including ozone (O₃), carbon monoxide (CO), nitrogen dioxide (NO₂), sulphur dioxide (SO₂) and for aerosols are improved by assimilating satellite retrievals of atmospheric composition using the 4-dimensional variations (4D-
- Var) data assimilation system (Benedetti et al., 2009; Inness et al., 2013; Massart et al., 2014, Inness et al., 2015) of the European Centre for Medium Range Weather Forecasts (ECMWF).

A wealth of new atmospheric composition data has become available with the launch of the Sentinel 5-Precursor (S5P) satellite in October 2017. S5P carries the TROPOspheric Monitoring Instrument (TROPOMI) which provides high resolution spectral measurements in the ultraviolet (UV), visible (VIS), near infrared (NIR) and shortwave-infrared (SWIR) part of the spectrum. This wide spectral range allows several atmospheric trace gases to be retrieved, e.g. O₃, NO₂, SO₂ and HCHO from the UVVIS, and CO and CH₄ from the SWIR part of the spectrum. These species are all included in the CAMS system, making TROPOMI the perfect instrument to provide observations for the CAMS NRT analysis at unprecedented horizontal resolution of about

25 3.5 km x 7 km for the TROPOMI UVVIS and 7 km x 7 km for the SWIR products. In this paper, we evaluate TROPOMI_NRT total column ozone (TCO3) retrievals (V1.0.0-V1.1.2) produced by the Deutsche Zentrum für Luft- und Raumfahrt (DLR) against the CAMS ozone analysis for the period 26 November 2017 to <u>30 November 2018 and carry out first assimilation tests</u> with the TROPOMI TCO3 data in the CAMS system. The satellite was still in its so-called commissioning phase until 24 April 2018 which is mainly used for functional testing, in-flight calibration and testing of processing chains. Nevertheless,

30 observations were available in these early months and <u>are included in our study as their quality was good enough to allow us</u> to prepare the CAMS system for the new data.

Ozone plays an important role in tropospheric chemistry. Tropospheric ozone is a regional scale pollutant and, at high concentrations near the surface, harmful to humans and vegetation. Photolysis of ozone, followed by reaction with water

- 35 vapour, provides the primary source of the hydroxyl radical. Ozone is also a significant greenhouse gas, particularly in the upper troposphere (Hansen et al. 1997). Tropospheric ozone is formed when Nitrogen Oxides (NOX), CO, and Volatile Organic Compounds (VOCs) react in the presence of sunlight. In urban areas in the northern hemisphere (NH) high ozone levels usually occur during spring and summer. About 90% of the total ozone amount resides in the stratosphere, a result of oxygen photolysis as first explained by Chapman (Chapman, 1930). This ozone layer absorbs a large part of the sun's harmful UV radiation.
- 40 Anthropogenic chlorofluorocarbons led to a global decrease of the ozone total column, with potentially catastrophic consequences avoided thanks to the Montreal Protocol (Newman et al., 2009). Over Antarctica, ozone destruction during

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Deleted: 1% in the vertical for averaged zonal mean O₃ mixing ratios. Compared to independent observation (Brewer spectrometers, ozone sondes, IAGOS ozone profiles and GAW surface measurements) the differences between the assimilation run and a run without TROPOMI assimilation are also small. The only noteworthy differences between the experiment with and without assimilation of TROPOMI data are seen compared to IAGOS profiles at West African airports where the assimilation of TROPOMI improves the fit of the CAMS analysis to the independent data.

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Despite the small impact of TROPOMI TCO3 in the CAMS analysis it will be beneficial to include the TROPOMI TCO3 NRT data actively in the operational NRT CAMS analysis after more tests. This will add some redundancy and resilience in the system and will allow us to use a more robust observation system in case some of the other older instruments, whose retrievals are currently assimilated by CAMS, stop working.¶

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Austral spring still leads to strong and rapid depletion of the ozone layer ("ozone hole"). There is evidence that the ozone hole is slowly recovering (Strahan and Douglass, 2018; Weber et al., 2018) and predictions suggest it should return to pre-1980s levels by the 2060s (Newman et al. 2006). Stratospheric ozone destruction also happens on a smaller scale over the Arctic in boreal spring (Manney et al., 2011) while ozone downward trends in the mid-low latitude lower stratosphere are related to atmospheric dynamics (Chipperfield et al., 2018).

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Ozone interacts with radiation and is therefore an important parameter in radiation schemes used in Numerical Weather Prediction (NWP) models (e.g. Hogan et al., 2017), where an improved representation of the ozone field can lead to improvements in weather forecasting or climate simulations. Ozone and the assimilation of ozone retrievals was therefore included in ECMWF's Integrated Forecast System (IFS) system in the late 1990s (Hólm et al., 1999) and a stratospheric ozone parameterization based on Cariolle and Teyssèdre (2007) is still used in the operational ECMWF NWP system where ozone

retrievals and ozone sensitive radiances are assimilated (Dethof and Hólm, 2004; Dragani and McNally, 2011; Dragani, 2013). Because this stratospheric ozone parameterisation does not provide realistic tropospheric ozone fields, a comprehensive tropospheric chemistry scheme is used in the CAMS system (Flemming et al., 2015; Flemming et al., 2017).

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It is hoped that by adding the assimilation of TROPOMI TCO3 NRT data in the CAMS system, CAMS ozone analyses and forecasts will be improved and that resilience is added in the system against the loss of any of the older instruments whose TCO3 retrievals are currently assimilated by CAMS (see Table 1 below). In a first step, the TROPOMI TCO3 data are monitored passively with the CAMS system. This means they are included in the CAMS data assimilation system, the model 20 fields are interpolated in time and space to the location of the observations and the model equivalents of the observations are calculated allowing temporal and spatial statistics of the differences between the observations and collocated model fields to be determined. However, the data are not actively used in the assimilation at this stage and do not influence the analysis and subsequent forecast yet. We call this 'monitoring' of the observations. In a second step, the active assimilation of the TROPOMI TCO3 data is tested and their impact on the CAMS ozone analysis is assessed by looking at independent validation 25 data.

The differences between the observations and the model fields are called departures. We distinguish between first-guess departures (observations minus model first-guess field) and analysis departures (observations minus analysed field). The firstguess field is a forecast initialised from the previous analysis cycle that is not changed by the analysis increments of the current

30 analysis cycle. If the model fields are stable the departures normally show a relatively smooth behaviour from day to day. Long term monitoring of the departures can disclose errors and biases in the satellite data products, as well as errors or biases in the model. Because the departures are smaller than the absolute observation values, they show up day-to-day changes better than when looking at the absolute model fields or observation values. A sudden jump in the departures on a global scale, which is larger than the instrument noise, can be an indication of problems in the observations or the model.

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Including TROPOMI TCO3 data passively in the CAMS system enables us to carry out a continuous quality assessment of the data, to detect biases between different satellite retrievals (e.g. between TCO3 from TROPOMI and the Ozone Monitoring Instrument (OMI) or the Global Ozone Monitoring Experiment-2 (GOME-2)) and allows us to monitor instrument and algorithm stability. The advantage of using an assimilation system to monitor satellite data is that it provides continuous global

coverage and allows us to build up global and regional statistics quickly. If the monitoring shows the data to be of good quality, e.g. departures are stable, there are no sudden jumps, the biases with respect to the model are small, assimilation tests with the data usually follow.

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This paper is structured in the following way. Section 2 describes the CAMS model and data assimilation system as well as the TROPOMI TCO3 NRT retrievals and how they are used in the CAMS system. Section 3 shows results of monitoring experiments with the TROPOMI TCO3 data, results from first assimilation tests with the data and the validation of the resulting ozone analyses with independent observations. Section 4 gives the conclusions.

2 Model and Observations

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2.1 CAMS model and data assimilation system

The chemical mechanism of the IFS is an extended version of the Carbon Bond Mechanism 5 (CB05, Huijnen et al. 2010) as originally implemented in the Chemical Transport Model (CTM) Transport Model 5 (TM5) and is documented in Flemming et al. (2017). This is a tropospheric chemistry scheme, and for stratospheric ozone the chemical tendencies above the tropopause are computed by a parameterisation based on Cariolle and Teyssèdre (2007). The spatial resolution of the model is approximately 40 km (T511 spectral and 0.35° by 0.35° grid), i.e. coarser than the 3.5 km x 7 km resolution of the TROPOMI TCO3 data The CAMS system uses MACCity anthropogenic emissions (Granier et al., 2011), biomass burning emissions from the Global Fire Assimilation System (GFAS, Kaiser et al., 2012) and biogenic emissions form the MEGAN model (Guenther et al., 2006).

ECMWF's IFS uses an incremental 4D-Var data assimilation system going back to Courtier et al. (1994). The data assimilation system for the atmospheric composition fields remains unchanged to the one described in Inness et al. (2015). The atmospheric composition fields are included in the control vector and minimized together with the meteorological control variables. The CAMS NRT system uses 12-hour assimilation windows from 03 UTC to 15 UTC and 15 UTC to 03 UTC and two minimisations at spectral truncations T95 (~ 210 km) and T159 (~ 110 km).

- Several ozone retrievals are assimilated in the CAMS NRT system (see Table 1). These include TCO3 retrievals from OMI on the Aura satellite and GOME-2 on Meteorological Operational satellite programme (Metop)-A and -B satellites (referred to as
 GOME-2AB), O₃ profile data from the Microwave Limb Sounder (MLS) and O₃ partial columns from Solar Backscatter Ultra-Violet (SBUV/2) and from the Ozone Mapping and Profiler Suite (OMPS). The GOME-2 and OMI TCO3 retrievals are thinned to a horizontal resolution of 0.5° x 0.5° by randomly selecting an observation in a grid box. The MLS profiles and
- partial column SBUV/2 and OMPS data are used unthinned at present The O₃ retrievals assimilated in the CAMS system are total or partial column data, i.e. integrated layers bounded by a top and a bottom pressure. The model's background column
 value is calculated as a simple vertical integral between the top and the bottom pressure of the partial or total columns, at the time and location of the observations. Averaging kernels are currently not used for the assimilation of ozone retrievals in the
- CAMS system, It is planned to test their use in the future.

A variational bias correction (VarBC) scheme (Dee and Uppala, 2009) where biases are estimated during the analysis by 35 including bias parameters in the control vector was used for several of the O₃ retrievals. In this scheme, the bias corrections are continuously adjusted to optimize the consistency with all information used in the analysis. VarBC is applied to the TCO3 retrievals from OMI and GOME-2 and to the partial column OMPS data, with solar elevation and a global constant as predictors, while the partial column SBUV/2 and the profile MLS data are used to anchor the bias correction, i.e. are assimilated without correction. Experience from past experiments had shown that it is important to have an anchor for the O₃ bias

40 correction, to avoid drifts in the O₃ fields (Inness et al., 2013).

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Deleted: , because they were either not available with the data or because the use of height resolved profile data such as MLS made their use unnecessary. Furthermore, the use of averaging kernels for stratospheric trace gas columns is not as important as for tropospheric/boundary layer trace gases (such as tropospheric NO₂). However, the use of averaging kernels for the ozone assimilation will be tested in future.

Variational quality control (Andersson and Järvinen, 1999) and first-guess quality checks are applied to all O_3 data in the CAMS system. The variational quality control reduces the weight given to observations in the analysis if they have large background departures. In the first-guess quality check, observations are rejected if the square of the normalized background departure exceeds its expected variance by more than a predefined multiple (5 for most variables).

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2.2 TROPOMI TCO3 NRT retrievals

TROPOMI has a local overpass time of 13:30 UTC, a ground pixel size of 3.5 km x 7 km for TCO3 and other gases retrieved from the UVVIS, a swath of 2600 km and provides daily global coverage with ~14 orbits per day. For the work in this paper we use <u>NRT</u> TROPOMI TCO3 data (Loyola et al.: 2019b). These include TROPOMI data (V1.0.0) for the period 26 November

- 10 2017 to 3 May 2018, V1.0.0 that were reprocessed with the NRT algorithm and NRT TROPOMI data V1.0.0-V1.1.2 for the period 11 June to 30 November 2018 (see Table 2). No data were acquired at ECMWF from 4 May to 10 June 2018 for technical reasons. The TROPOMI TCO3 retrieval is based on the GDP 4.x algorithm original developed for GOME (van Roozendael et al., 2006), adapted to SCIAMACHY (Lerot et al., 2009) and further improved for GOME-2 (Loyola et al., 2011; Hao et al., 2014). The major TCO3 algorithm updates for TROPOMI compared to the heritage algorithms used for GOME-2
- 15 are the more precise treatment of clouds as scattering layers (Loyola et al., 2018), an optimized wavelength for the calculation of air mass factors, (328.2 nm instead of 325.5 nm), better a-priori ozone profile information (including the tropospheric climatology by Ziemke et al. (2011)) and a destriping correction. This destriping correction was introduced because total vertical ozone columns showed small striping structures. The correction factor is based on the ratio between the mean for individual rows and the mean for all rows over a certain region and period. We averaged the total columns within the tropics
 20 for January to April 2018 for both all 450 rows individually and over all 450 rows, resulting in an array of 450 numbers,
- ranging between 0.99 and 1.015. Multiplying the VCD with the correction factor changes the result by about ±1%. The correction factor has been rechecked but no update seemed necessary up to now. The TROPOMI retrieval is described in the S5P/TROPOMI Total Ozone ATBD (Spurr et al., 2018).
- 25 We use the following quality checks to remove any outliers of the TROPOMI TCO3 data. Data are only used if:
 - 1. Value of quality flag given in the data ('qa flag') between [0, 100]
 - 2. Ozone values between [0,900 DU]
 - 3. Surface altitude between [-399, 8850m]
 - 4. Cloud Fraction between [0,1]
- 30 <u>5. Latitude between</u>
 - a. [-90°, 90°] for the monitoring assimilation (section 3.1)
 - b. [-60°, 60°] in the active assimilation (section 3.2)

Data that pass the above four checks are flagged as 'good' and used for the studies presented in this paper. In the current TROPOMI TCO3 products V1.1.x (Pedergnana et al., 2018) the 'qa flag' will allow the user to identify good quality data, but this was not yet the case in V1.0.0. For consistency with the earlier period the qa value filter was not applied for version 1.1.2 data in this study.

Because the horizontal resolution data of TROPOMI (3.5 km x 7 km) is higher than the model resolution of T511 (about 40

40 km x 40 km) the TROPOMI data are not spatially representative for the model grid boxes. To overcome this representativeness error, the data are converted to so called 'super-observations' before they are included in the CAMS system. For this superobbing the data are averaged to the T511 resolution of the model. The averaging is carried out for all 'good' data and the errors Deleted: V1.0.0) that were reprocessed with the NRT algorithm (Deleted: ., 2019) Deleted: . ¶

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of the data are averaged in the same way as the observations. The super-obbing reduces the random errors in the data. In the past a 'random' thinning to 0.5% 0.5% was used in the CAMS system and this is still applied to the TCO3 retrievals from GOME-2 and OMI. The super-obbing applied to TROPOMI data has the advantage that it does not simply throw out the majority of the observations but uses the information from all good data to create average observations. In future, super-obbing

5 will also be tested for the other ozone datasets. An example of TROPOMI TCO3 NRT data at full resolution and super-obbed to T511 is shown in Figure 1. The super-obbing reduces the number of 'good' TROPOMI TCO3 data from about 15-16 million per day to about 500,000 while still making use of the information given by all good data.

3 Results

10 Two experiments were run with NRT TROPOMI TCO3 data super-obbed to T511 horizontal resolution. In the first control experiment (CTRL, section 3.1) the TROPOMI data were included passively, in the second one (ASSIM, section 3.2) they were actively assimilated. The experiments cover the period from 26 November 2017 to <u>30 November</u> 2018 and were run using CY45R1 of the CAMS system. We look at timeseries for the whole period and also at fields averaged over the periods February to April (FMA) and September to November (SON) 2018.

15 3.1 Monitoring of TROPOMI TCO3 NRT data

Figure 2a shows a timeseries of zonal mean weekly averaged TCO3 values from TROPOMI for the period 26 November 2017 to 30 November 2018. The timeseries shows a realistic evolution of the ozone field with high column values in the NH during winter and spring, low values in the Tropics throughout the year, higher values in the circum-Antarctic band and the lowest absolute values over the Antarctic during the ozone hole from August to November 2018. We also see a longer period without

- 20 TROPOMI data in January 2018 when the instrument was undergoing calibration activities. From mid-February 2018 onwards (outside the data gap in May/ June when data were not acquired by ECMWF) the number of data is more stable (not shown) except from one week with low data numbers in March. To assess the quality of the TROPOMI data they are compared with the other three TCO3 retrievals that are routinely assimilated in the CAMS NRT system, i.e. OMI and GOME-2AB in Figure 2b-2d. The TROPOMI NRT DOAS retrieval is a further development of the operational AC-SAF GOME-2AB DOAS,
- 25 therefore a better agreement can be expected for the comparison for those sensors compared to OMI where a different algorithm (TOMS-like) is applied. The differences between TROPOMI and OMI are positive (i.e. TROPOMI values higher than OMI) in most latitude bands throughout the timeseries. Negative differences (i.e. TROPOMI values lower than OMI) are found at the northern ends of the orbits from December 2017 to April 2018 and September to November 2018, and also south of 60°S, particularly from March to October when UVVIS retrievals generally have larger problems because of the illumination
- 30 conditions and the icy surfaces. On top of that, the TROPOMI retrievals have a larger bias at high latitudes because the current NRT algorithm uses a surface climatology that does not fully represent the actual snow/ice conditions. Over large parts of the timeseries the differences are below 4-6 DU corresponding to less than 2%. Larger departures are seen during some of the commissioning and differences of up to 20 DU are seen north of 40°N during the first half of the timeseries. However, TCO3 values are also larger at this time (Figure 2a) so this still corresponds to agreements within about 5%. The differences between
- 35 TROPOMI and GOME-2AB (Figure 2c and d) are smaller than the differences with OMI between 60°N and 60°S, but larger negative differences are found at the northern end of the orbits, especially south of 60°S. Again, larger departures are seen during some of the commissioning phase. Apart from these periods the differences between the TROPOMI and GOME-2AB data for latitudes between 60°N and 60°S are between 2-6 DU or less than about 2%.

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Deleted: Figure 2 shows the mean TCO3 fields averaged over the period from 26 November 2017 to 3 May 2018 from TROPOMI and the other three TCO3 retrievals that are routinely assimilated in the CAMS NRT system, i.e. OMI and GOME-2AB. For TROPOMI 'good' data (see Section 2.2) super-obbed to T511 are shown, while for the other three instruments 'used' data are shown, i.e. the data that passed all quality and blacklist checks (see Table 1) and were actively assimilated. Figure 2 shows that all four instruments agree well and TROPOMI successfully captures the structures of the global ozone field with high values in the NH Extratropics. low values in the Tropics and higher values in a band surrounding Antarctica.

Figure 3 shows difference plots of TROPOMI and the other retrievals and illustrates that there are pronounced differences between the data sets that show up less clearly when looking at the absolute fields in Fig. 2. TROPOMI is higher than the other three retrievals in the NH south of 60°N, with positive differences of up to 60 DU in places between about 40-60°N. Poleward of that, TROPOMI is mainly lower than GOME-2AB while there are positive and negative differences compared to OMI. In the southern hemisphere (SH), the differences are smaller and mainly negative between 0-60°S, but larger negative differences are found over Antarctica. Because the differences show similar structures over Antarctica for OMI and GOME-2AB they are likely to point to problems with the TROPOMI retrievals rather than the other datasets. ¶

Figure 4 shows maps of the standard deviation of the four TCO3 retrievals over the period from 26 November 2017 to 3 May 2018. All retrievals show the same features with highest variability in the northern Extratropics and lowest variability in the Tropics.¶

Figure 5 shows mean analysis departures from the four TCO3 retrievals. Because the GOME-2AB and OMI retrievals are actively assimilated in the CAMS system and the analysis is drawing to the data their analysis departures are generally smaller than TROPOMI's. OMI has larger analysis departures than GOME-2AB with negative departures in the high Arctic and positive departures over the Tropics and over sea south of about 60°S. This might point to a problem with the OMI retrievals, which is not completely removed by the bias correction during the analysis. TROPOMI shows larger analysis departures than the other three retrievals, partly because the data are not being assimilated, but also because of issues with the TROPOMI NRT TCO3 retrievals. These problems show up better in the departure plots than in the plot of absolute values (Fig. 2). TROPOMI is lower than the CAMS analysis south of 60°S and over land or snow/ice north of 60°N. Figure 3 shows the mean TROPOMI TCO3 fields averaged for FMA and SON 2018 and the differences between TROPOMI, OMI and GOME-2AB. TROPOMI shows high TCO3 values in FMA during spring in the NH and low values over the Antarctic ozone hole during SON. The Figure shows that there are large differences between TROPOMI and GOME-2AB polewards of about 60° which seem to be mainly negative over ice and sea and positive over land. During FMA there are also large

- 5 differences in the NH north of about 40°N. However, these differences are still within about 20 DU (or less than 5%) in most areas south of 60°N for GOME-2B and only slightly larger for GOME-2A. These differences come mainly from the surface albedo climatology that is used in the TROPOMI NRT retrieval algorithm of the V1.0.0 <u>- V1.1.2</u> data. The employed surface albedo climatology, based on OMI data (Kleipool et al., 2008), has a spatial resolution of 0.5° x 0.5° which seems coarser than the spatial resolution of the TROPOMI pixels. Consequently, surface albedo structures are found in the obtained TCO3 results,
- 10 particularly over the polar regions where the surface albedo climatology sometimes has very few grid cells marked as no snow or ice (reflectivity 0.05) whereas the reflectivity is close to one for the neighbouring ones with snow. In the future, it is planned to replace this coarse climatology with a new surface albedo retrieval using S5P data (Loyola et al., 2019a). For all three instruments, the differences in the NH are smaller in SON than FMA. During summer, when there is no snow cover, the resolution of the surface albedo is less of an issue and larger positive differences between TROPOMI and GOME-2AB are
- 15 confined to Alaska and Kamchatka. We expect the largest problems to occur in spring and autumn when the snow cover changes locally. Equatorward of those areas the differences between the instruments are smaller. Over oceans TROPOMI and GOME-2AB mainly agree to within ± 4 DU, i.e. less than about 2% of the tropical TCO3 values, with slightly larger differences over land (up to 10 DU, ~ 5%). During SON, negative differences of up to -6 DU are found over the maritime continent. This is probably caused by the update of the a priori in the TROPOMI algorithm V1.1.2, as the new one takes the tropospheric ozone wave one structure into account. The differences between TROPOMI and OMI are slightly larger than the differences between GOME-2AB and TROPOMI, but still less than about 8 DU (or 4%) over larger parts of the Globe, with TROPOMI generally higher than OMI except over the Maritime continent. Over Antarctica and some areas north of 40°N positive and negative deviations are found. Because the differences over Antarctica show similar structures for OMI and GOME-2AB they are likely to point to problems with the TROPOMI retrievals using the OMI surface climatology rather than the other datasets.
 - Figure 4 shows maps of the standard deviation of the four TCO3 retrievals over the whole period from 26 November 2017 to 3 November 2018. All retrievals show the same features with highest variability in the high northern latitudes and over Antarctica where TCO3 values vary most during the course of a year and the lowest variability in the Tropics.

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- 30 We now look at differences between TROPOMI and the CAMS ozone analysis, i.e. analysis departures. These departure plots show problems in the TROPOMI data more clearly than the comparison between instruments in Figure 3, because they are not affected by issues from two different retrievals. Nevertheless, the main findings from Figure 5 are similar to those from Figure 3. Figure 5a shows a timeseries of zonal mean weekly averaged TROPOMI analysis departures for the period 26 November 2017 to 30 November 2018 and like Figure 3 has the largest, mainly negative, departures polewards of 60°. Between 50°N and
- 35 60°S the zonal mean departures are within ±2-4 DU during most of the timeseries, i.e. less than 2% of the zonal mean TCO3 (Figure 2a). Larger positive departures are found between 50-60°N until August 2018 and between 50-60°S after the end of March. After the latest algorithm change to V1.1.2 in August, the zonal mean departures are less than ±2 DU between 60°N and 60°S most of the time and also smaller than -4 DU for most of the time between 60-90°S. During FMA (Figure 5b) TROPOMI is lower than the CAMS analysis south of 60°S and over land or snow/ice north of 60°N. TROPOMI is considerably
- 40 higher than the CAMS analysis over land in the NH north of about 40°N with differences between 20-40 DU in places, a result of the issues with the surface albedo climatology discussed above. However, as TCO3 values are also large in these areas (see Figure 3a1), this is still within about 10% of the mean observation values. Large positive TROPOMI TCO3 departures are also seen over the Himalayas in FMA. In the other areas, TROPOMI agrees better with the model, with positive departures over

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the tropical Atlantic, Africa and South America (up to 8 DU, about 4%) and small negative departures elsewhere. During SON (Figure 5c) the departures are generally smaller than during FMA, especially over land in the NH. The largest negative departures are found over sea/ice north of 60°N (up to -20 DU). Over the Maritime continent larger negative departures (up to -8 DU) are found during SON and FMA. As mentioned above this is probably caused by the update of the a priori in the

5 TROPOMI retrievals that takes the tropospheric ozone wave one structure into account. We will show in section 3.2.2 that the assimilation of TROPOMI improves the CAMS results compared to tropospheric ozone sondes and IAGOS measurements in the Tropics, suggesting these differences point to a model bias rather than a problem with the data.

Table 3 lists mean biases and their standard deviations for the first half (November 2017-May 2018) and the second half (June)
 - November 2018) of the timeseries. Averaged over November 2017-May 2018 TROPOMI shows a mean bias with respect to CAMS of -1.07±17.3 DU between 90-60°N, 2.10±9.47 DU between 60-30°N, 0.06±3.83 DU between 30°N-30°S, -0.05±4.95 DU between 30-60°S and -6.81±7.32 DU between 60-90°S. The mean bias between 90-60°N is relatively small because the positive biases over land and the negative ones over ice compensate (see Figure 5a and b). This is also illustrated by the large

standard deviation between 90-60°N. Table 3 also lists the values from the other three TCO3 retrievals and shows that the

- 15 mean biases of TROPOMI are larger than GOME-2AB's between 90-30°N and between 60-90°S, but smaller between 30°N and 60°S. TROPOMI has smaller mean biases than OMI in all areas except 60-90°S. The standard deviations of the TROPOMI departures are larger than GOME-2AB's in all areas and larger than OMI's between 90-30°N and between 60-90°S but smaller than OMI's between 30°N and 60°S. It should be born in mind though, that 'used' data are shown for GOME-2AB and OMI and the CAMS analysis draws to the data thus reducing the standard deviation of the departures, while 'good' data are shown
- 20 for TROPOMI and the TROPOMI data no not affect the CAMS analysis. For June to November 2018 TROPOMI has mean bias of -1.46±10.40 DU between 90-60°N, 0.31±6.00 DU between 60-30°N, -0.47±3.88 DU between 30°N-30°S, 0.82±10.10 DU between 30-60°S and -2.39±6.99 DU between 60-90°S. Again, the TROPOMI biases and standard deviations of the departures are larger than GOME-2AB's in most areas while the biases are smaller than OMI's between 90°N-30°S and larger between 30°-90°S.
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Figure 6 shows scatter plots of TROPOMI TCO3 analysis departures for the period 26 November 2017 to <u>30 November 2018</u> against latitude, solar elevation and scan position. Such plots can be very useful in identifying retrieval problems depending on the chosen parameters. <u>In FMA, the scatter plot against latitude shows small mean departures between about 60°S and 45°N</u>, positive departures between <u>45</u>°N and 70°N and negative departures <u>polewards</u> of 70°N and 60°S. This <u>agrees</u> with the averaged

- 30 analysis departures shown in Fig. <u>5b</u> and the Hovmoeller plot in Fig. <u>5a</u> and illustrates that there is a problem with the retrievals at high latitudes. The plot also shows that there is a large scatter polewards of 50°N and 60°S. Larger scatter at high latitudes is also seen for OMI and GOME-2AB if all 'good' data are plotted (not shown). <u>In SON, the mean departures plotted against</u> <u>latitude are generally small and do not show high values between 45-70°N any more. They are still negative polewards of 70°N</u> <u>and 60°S, but smaller than in FMA. In FMA</u>, the TROPOMI departures show a <u>strong</u> dependency on solar elevation with
- 35 increasingly negative departures at solar elevations below 25°. The SOE dependency is smaller in SON. For a sun synchronous orbiting satellite, the SOE is mainly a function of the latitude, therefore this deviation might be caused by the latitudinal deviation discussed above. Departures in both seasons vary slightly depending on the scan position with increasingly negative departures towards the edges of the scan, especially on the western side of the scan. There is no dependency of the departures on cloud cover or cloud top pressure (not shown).
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Deleted: similar to OMI) and small negative departures elsewhere. Figure 5 illustrates the power of using a global assimilation system to monitor new data sets, as it gives a global picture and builds up statistics quickly

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Figure 7 shows timeseries of daily mean area averaged TROPOMI TCO3 departures, observation and analysis values as well as th number of observations from 26 November 2017 to 3 May 2018 for the NH, the Tropics and SH. The Figure shows that there are long periods without TROPOMI data in December 2017 and January 2018 when the instrument was undergoing calibration activities and a shorter period without data at the beginning of March 2018. The S5P satellite was still in its commissioning phase until 24 April 2018 which led to interruptions of the data availability. From mid-February onwards the number of data is more stable and the departures are smoother. The departures are positive in the NH and Tropics and negative in the SH. In the NH, the TROPOMI analysis departures are actually larger than the first-guess departures from mid-February onwards, showing that the assimilation of GOME-2AB and OMI adds information to the analysis that is contrary to the TROPOMI data. In the Tropics, the TROPOMI analysis departures are generally smaller than the first-guess departures illustrating that the data are more consistent with the other O3 data used in the analysis as the assimilation of the other data improves the fit of the analysis to the (not assimilated) TROPOMI data. In the SH, the TROPOMI firstguess and analysis departures are similar. Comparing the magnitude of the departures with the observation and analysis values shows that in relative terms the area averaged TROPOMI departures are small. They are less than 1% in the NH and SH and less than 0.5% in the Tropics.¶

Figure 8 shows a timeseries of zonal mean daily analysis departures from TROPOMI and illustrates that the evolution of the departures with time is quite stable between about 60%-60% where departures are small, but that there are larger variations (and larger departure)

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3.2 Assimilation tests with TROPOMI TCO3 NRT data

We showed in section 3.1 that the TROPOMI TCO3 data are of good quality over large parts of the globe, but that there are <u>some</u> issues at high latitudes and low solar elevations, <u>especially in FMA</u>. The biases we observe outside those regions are of similar magnitude to the biases of the other total column data sets assimilated in CAMS (see Table 3) and we therefore do not expect any problems with the assimilation of TROPOMI NRT TCO3 if we bias correct the data and blacklist them appropriately. Hence, assimilation tests are carried out with the TROPOMI NRT TCO3 data for the period 26 November 2017 to 30 Nov 2018, blacklisting them for solar elevations less than 10° and poleward of 60°. <u>Restricting the assimilated data</u> between 60°S and 60°N excludes the "ozone –hole" observation in these tests. Variational bias correction is applied to the data in the same way as it is used for the other TCO3 data, i.e. with solar elevation and a global constant as predictors. <u>The choice of these bias correction parameters can be altered in the future if needed.</u>

3.2.1 Impact of the TROPOMI assimilation

Figure 2 shows timeseries of global mean weekly averaged_TROPOMI, OMI and GOME-2AB TCO3 departures, bias correction, standard deviation of departures and number of observations between 26 November 2017 and 30 November 2018 for 'used data', i.e. the data that fulfil the <u>blacklist criteria and quality checks</u> listed in Table 1 and pass the variational quality

15 control and first-guess checks applied by the IFS (see section 2.1). The figure shows that the TROPOMI bias correction successfully removes the <u>biases</u> between the data and the model, so that the bias corrected analysis departures are small. The bias correction <u>calculates maximum</u> values of about <u>1</u> DU in the global mean with the largest positive values between June and August and the largest negative values in November 2018. The magnitude of the global mean bias correction that is applied to TROPOMI is smaller than that of the other three TCO3 retrievals. Figure 7 shows that the analysis is drawing to the

20 TROPOMI data (and the other three datasets), i.e. analysis departures are smaller than the first-guess departures and the standard deviation of the departures is reduced. About 2.4 million TROPOMI observations are used every week which is 10x as many observations as from OMI, 5x as many as from GOME-2A and 3x as many as from GOME-2Br

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Figure <u>&a</u> shows a timeseries of the zonal mean weekly averaged bias correction that is applied to TROPOMI data for the period 26 November 2017 to 30 November 2018. The Figure illustrates how the bias correction changes with time as it adapts to the data and that the mean bias-corrected TROPOMI analysis departures for <u>FMA</u> (Figure <u>8b</u>) and <u>SON</u> (Figure <u>8c</u>) are small compared to <u>CTRL</u> (Figure <u>5b</u> and <u>c</u>) as the analysis is drawing to the <u>TROPOMI</u> data. Some larger positive departures for remain over land in the NH in <u>FMA</u> where observation outliers are given less weight by the analysis.

Figure 2 shows the mean TCO3 fields from ASSIM for FMA and SON 2018 as well as the absolute and relative differences between ASSIM and CTRL. It illustrates that the impact of the TROPOMI assimilation in relative terms is small with relative differences of less than 2% everywhere and less than 1% in most areas. The absolute differences are largest over land in the

40 NH in FMA with ASSIM up to 10 DU higher than CTRL. However, the absolute TCO3 values are also largest then. Positive differences are also found in an area stretching from South America over the Atlantic to Africa in FMA and SON and in small bands around 60°S. In most other areas, the differences are below -2 DU and negative.

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Figure <u>10</u> shows cross sections of zonal mean relative O₃ mixing ratio differences from ASSIM minus CTRL averaged over <u>FMA and SON</u>. Again, the impact of TROPOMI assimilation is small <u>with the</u> largest relative differences <u>found</u> in the troposphere. <u>Here</u> the TROPOMI data act to lower the ozone values in ASSIM in the zonal mean. In FMA the impact is less

5 than 1% everywhere. In SON, the differences in the troposphere are slightly larger and reach values of up to -3% near the surface in NH midlatitudes and over the South Pole. Note that no TROPOMI data were assimilated south of 60°S so the changes seen here come from transport. Also, note that the absolute O₃ values in the lower troposphere over the Antarctic are small.

3.2.2 Validation with independent observations

- 10 To assess if the assimilation of TROPOMI TCO3 retrievals improves or degrades the CAMS analysis, the O₃ fields from ASSIM and CTRL are compared with independent observations. We use for comparison the following datasets. (1) Brewer spectrometer measurements obtained from the World Ozone and Ultraviolet Radiation Data Centre (WOUDC). The Brewer data are well calibrated with a precision of 1% (Basher, 1982). (2) Ozone sonde data from a variety of data centres: WOUDC, Southern Hemisphere ADditional OZonesondes (SHADOZ), Network for the Detection of Atmospheric Composition Change
- 15 (NDACC), and campaigns for the Determination of Stratospheric Polar Ozone Losses (MATCH). The precision of electrochemical concentration cell (ECC) ozone sondes is on the order of ±5% in the range between 200 and 10 hPa, between -14% and +6% above 10 hPa, and between -7% and +17% below 200 hPa (Komhyr et al., 1995). Larger errors are found in the presence of steep gradients and where the ozone amount is low. The same order of precision was found by Steinbrecht et al. (1998) for Brewer–Mast sondes. (3) Ozone profiles from instruments mounted on commercial aircraft from the In-service
- 20 Aircraft for a Global Observing System (IAGOS). The IAGOS ozone data have a detection limit of 2 ppbv and a precision of ± (2 ppbv + 2 %) (Marenco et al.,1998). (4) Ground-based data from the World Meteorological Organisation's Global Atmosphere Watch (GAW) surface observation network (e.g., Oltmans and Levy, 1994; Novelli and Masarie, 2014). The GAW observations represent the global background away from the main polluted areas. GAW O₃ data have a precision of ±1 ppbv (Novelli and Masarie; 2014).
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Figure 11 shows timeseries of the weekly averaged TCO3 biases from ASSIM and CTRL against Brewer measurements averaged over the Globe and <u>NH midlatitudes for the period 26 November 2017 to 30 November 2018. The Figure shows a generally good agreement of both experiments with the Brewer data with maximum biases of less than 6 DU. It confirms that the impact of the TROPOMI assimilation in the CAMS system is small with differences between ASSIM and CTRL of less
than 1 DU in the total column. Despite being small, the impact usually leads to an improved fit to the WOUDC data in ASSIM.
</u>

Compared with ozone sondes <u>averaged over FMA (Figure 12)</u> and <u>SON (Figure 13)</u> the impact in relative terms is also small. However, an improved fit to the data is seen in ASSIM in the Tropics during SON when the positive bias seen in CTRL is reduced. Ozone profiles from ASSIM and CTRL are also compared with IAGOS aircraft data (Figure 14). Because not many
IAGOS profiles were available during October and November 2018 we show FMA and July-September (JAS) 2018. In both seasons, we see a positive impact from the assimilation of TROPOMI TCO3 data over West African airports where the negative bias seen in CTRL is reduced when assimilating TROPOMI TCO3 data. This increase in tropospheric O₃ agrees with the increased <u>TCO3</u> seen in <u>ASSIM</u> over Africa in FMA and <u>SON (Figure 9)</u>, but does not show up in the <u>zonal mean cross</u> sections (Figure 10).

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Finally, we compare ASSIM and CTRL with GAW O_3 surface observations over Europe in Figure 15 and again see only a small, slightly negative impact. However, only very few GAW stations were available and the mean are calculated from between 3-5 stations over Europe and more data would be needed for a meaningful validation of surface O_3 .

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On the whole, the impact of the TROPOMI assimilation in the CAMS system is relatively small because the CAMS analysis is already well constrained by the other O_3 data sets that are assimilated routinely which are a combination of TCO3 data (OMI, GOME-2AB), O_3 layers (SBUV/2, OMPS) and O_3 profiles (MLS) (see Table 1). If no other O_3 data were available and

- 10 only TROPOMI TCO3 data were assimilated the impact on the CAMS O₃ analysis would be larger. To confirm that TROPOMI could serve as a good replacement if one of the older TCO3 instruments (OMI, GOME-2AB) failed two further experiments were run for the period 26 November 2017 to 30 April 2018: one mimicking the configuration of CTRL, but without OMI (CTRL-OMI) and the other mimicking the configuration of ASSIM without OMI (ASSIM-OMI). Compared to ozonesondes and IAGOS data the differences between these experiments and ASSIM and CTRL are very small indeed. The largest
- 15 differences between the four experiments are found in the SH midlatitudes when compared with ozone sondes (Figure 16a) and over West African airports compared with IAGOS (Figure 16b). Even here, the differences between ASSIM and ASSIM-OMI are small and both fit the independent observations better than CTRL and CTRL-OMI. There is even a sign that removing OMI leads to a small improvement in the fit to IAGOS over West Africa. In all other areas the differences between the experiments with and without OMI were negligible when compared to sondes or IAGOS. These findings agree with results
- 20 from longer observation system experiments that were carried out with the CAMS system for the years 2013 and 2014 in a different context (not shown) which showed only small changes to the CAMS O₃ analysis if one of the TCO3 instruments was removed confirming that the CAMS analysis is well constrained and that there is some redundancy in the system. We are therefore confident that TROPOMI will be able to counterbalance the loss of one of the older TCO3 instruments. Removing MLS O₃ profiles has a much larger (negative) impact on the CAMS O₃ analysis (e.g. Flemming et al., 2011) and TROPOMI would not be able to replace the MLS profiles as it does not provided data with similar vertical resolution.

The main advantage of assimilating TROPOMI into the CAMS system seems to be the improvement of tropospheric ozone. This is because MLS defines the stratosphere whereas OMI, GOME-2 and TROPOMI are also sensitive to the troposphere and add extra information here (see also Lefever et al., 2015). Adding TROPOMI to the CAMS system fits the CAMS analysis better to independent trapospheric data

30 <u>better to independent tropospheric data.</u>

4 Conclusions

TROPOMI NRT TCO3 retrievals for the period 26 November 2017 to 30 November 2018 have been included in the CAMS data assimilation system to first monitor the data and to then carry out assimilation tests with them. The TROPOMI data used for the work presented in this paper were TROPOMI TCO3 data (V1.0.0) that had been reprocessed with the NRT algorithm
antil 3 May 2018 and NRT TROPOMI (V1.0.0 to v1.1.2) data for the period 11 June to 30 November 2018 (Loyola et al., 2019b). TROPOMI was still in its commissioning phase until 24 April 2018, but even the early, TROPOMI TCO3 data generally agreed well with the CAMS analysis over large parts of the Globe and were of good enough quality to test their use in the CAMS system.

40 Monitoring of TROPOMI TCO3 data in the CAMS system has shown that the data are of good quality over large parts of the Globe, The TROPOMI TCO3 biases, relative to the CAMS O₃ analysis are of similar magnitude to biases of OMI and GOME-

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2AB TCO3 between 60°N and 60°S and TROPOMI agrees with the CAMS ozone analysis to within 2% over large parts of the Globe in weekly mean zonal mean timeseries and averaged over FMA and SON 2018. However, there are problems with the TROPOMI TCO3 NRT retrievals at high latitudes, at low solar elevations and over snow/ice (e.g. Antarctica or ice-covered areas in NH). These differences, which are most prominent over land in the NH north of 45°N before May 2018, come mainly

5 from the surface albedo climatology that is used in the TROPOMI NRT retrieval algorithm and has a spatial resolution of 0.5° x 0.5° which is coarser than the spatial resolution of the TROPOMI pixels. It is planned to replace this climatology with a climatology based on TROPOMI data when data for a long enough period are available. The bias of TROPOMI TCO3 has a dependency on solar elevation, with increasingly negative biases at solar elevations less than 25°, especially in FMA 2018. During SON 2018 the dependency on solar elevation is considerably smaller. The bias of TROPOMI TCO3 relative to CAMS also depends slightly on scan position, with increasingly negative bias towards the western edge of the scan 10

Relative to CAMS and averaged over the period 26 November 2017 to 3 May 2018, TROPOMI TCO3 NRT data show a mean bias with respect to CAMS of 1.07±17.3 DU between 90-60°N, 2.10±9.47 DU between 60-30°N, 0.06±3.83 DU between 30°N-30°S, -0.05±4.95 DU between 30-60°S and -6.81±7.32 DU between 60-90°S. For June to November 2018 TROPOMI

15 has mean bias of 1.46±10.40 DU between 90-60°N, 0.31±6.00 DU between 60-30°N, -0.47±3.88 DU between 30°N-30°S, 0.82±10.10 DU between 30-60°S and -2.39±6.99 DU between 60-90°S. This paper illustrates the power of using a global assimilation system to monitor new satellite products, as it provides continuous global coverage, allows us to build up global and regional statistics quickly and can help to identify problems with the retrievals (e.g. biases against solar elevation, latitude, scan position, surface albedo dependencies, etc.) that might be more difficult to discover when comparing TROPOMI retrievals 20

against sparse in-situ observations.

Assimilation tests were carried out with the TROPOMI TCO3 data, blacklisting them poleward of 60° and at solar elevations less than 10°, and applying ECMWF's variational bias correction scheme to the data with solar elevation and a global constant as predictors. These assimilation tests showed that the bias correction successfully removed the biases between the model and

- 25 the data. <u>Overall</u>, the impact of the TROPOMI data in the CAMS assimilation system was found to be relatively small, because the ozone analysis is already well constrained by several other ozone data sets that are assimilated routinely (OMI, GOME-2AB, MLS, SBUV/2, OMPS). Mean differences between a run with and without assimilation of TROPOMI TCO3 NRT data over the FMA and SON 2018 were less than 2% for TCO3 everywhere and less than 1% in most areas. For average zonal mean O₃ mixing ratio profiles the differences between ASSIM and CTRL were less than 3% with the largest relative differences
- 30 found in the troposphere where the assimilation of TROPOMI TCO3 data led to decreased ozone values in the zonal mean. Zonal mean differences in the stratosphere where less than 1%.

ASSIM and CTRL show only small differences when compared with independent ozone observations, however these differences are mainly positive. There is a slightly improved fit to WOUDC Brewer TCO3 data in ASSIM. The largest impact 35 of the TROPOMI assimilation was found over West African airports, where the assimilation led to increased ozone values in the troposphere and a reduced negative bias against IAGOS aircraft profiles in FMA and SON 2018. A positive impact in the tropical troposphere was also seen against ozone sondes in SON 2018 where the zonal mean positive bias was reduced. It seems the main advantage of assimilating TROPOMI into the CAMS system is the improvement of tropospheric ozone. This is because MLS defines the stratosphere whereas OMI, GOME-2AB and TROPOMI are also sensitive to the troposphere and

40 add extra information here (see also Lefever et al., 2015). Adding TROPOMI to the CAMS system improves the fit of the CAMS analysis to independent tropospheric data and makes the CAMS system more resilient against the loss of any of the older TCO3 instruments that are currently assimilated. Assimilation tests show that good results are achieved when replacing OMI with TROPOMI.

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Deleted: as indicated by the large standard deviation. These biases are of similar magnitude to the biases of the other TCO3 datasets (OMI, GOME-2AB) assimilated in the CAMS system, though TROPOMI NRT TCO3 is up to 60 DU higher in NH mid-latitudes in places (Figure 3).

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Due to the limitations of the <u>current</u> TROPOMI TCO3 NRT product that uses a OMI climatology for the surface properties, ozone data had to be blacklisted at high latitudes in this study. Future algorithm updates dealing with a better treatment of the surface albedo (<u>Loyola et al., 2019a</u>) will improve the retrieval quality at high latitudes and should allow the data to be used up to the poles. The V1.1.2 data used after 8 August 2018 already show smaller departures south of 60°S. Note that the TROPOMI TCO3 offline algorithm does not have the limitation due to the surface albedo climatology seen in the NRT product

because the surface albedo is fitted as part of the retrieval.

TROPOMI TCO3 NRT data were included passively in the operational CAMS system on 13 July 2018, the day the data were officially released by ESA, and have been monitored routinely by CAMS ever since (see https://atmosphere.copernicus.eu/charts/cams_monitoring). Because of the small, but positive impact of the TROPOMI TCO3 assimilation on the CAMS ozone analysis shown in this paper it was decided to actively include the TROPOMI TCO3 NRT data in the operational NRT CAMS analysis, and the routine assimilation of the data in the operational CAMS analysis began on 4 December 2018.

Author Contributions

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A. Inness carried out the experiments described in the paper, the validation of the resulting analysis fields and wrote the manuscript, R. Ribas set up the S5P processing chain at ECMWF which included coding and testing the BUFR converter needed to ingest the TROPOMI TCO3 data in the ECMWF data system, J. Flemming helped with the development of the IFS
chemistry module, D. Loyola, W. Zimmer, K.-P. Heue, J. Xu, P. Valks, C. Lerot and M. van Roozendael developed the TROPOMI TCO3 retrieval algorithm and the operational processing chain at DLR. All co-authors gave useful comments during the writing of the paper.

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Thanks to the DLR colleagues Fabian Romahn and Mattia Pedergnana working on the operational UPAS system for generating TROPOMI TCO3 products and thanks to Maximilian Schwinger and the PDGS team at DLR responsible for the Sentinel-5 Precursor payload data ground segment. Thanks to Luke Jones for help with the plotting of ozone sondes, GAW and IAGOS data. Thanks to the data providers of the data assimilated in the CAMS reanalysis and the data used for the validation studies in this paper. The TROPOMI total ozone data are generated at DLR on behalf of EU/ESA. The GOME-2 total ozone data assimilated in CAMS are provided by DLR in the framework of the EUMETSAT AC-SAF project. The Copernicus

30 Atmosphere Monitoring Service is operated by the European Centre for Medium-Range Weather Forecasts on behalf of the European Commission as part of the Copernicus programme (http://copernicus.eu).

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Instrument/	Data product	Data provider/version	Blacklist criteria /	VarBC	Reference
Satellite			thinning	predictors	
GOME-2/	TCO3	AC-SAF/ DLR GDP4.8	QF>0	Solar elevation	Hao et al. (2014), Valks et al. (2017)
Metop-A			SOE<6°	Global constant	
			Thinned to 0.5°x0.5°		
GOME-2/	TCO3	AC-SAF/ DLR GDP4.8	QF>0	Solar elevation	Hao et al. (2014), Valks et al. (2017)
Metop-B			SOE<6°	Global constant	
			Thinned to 0.5°x0.5°		
MLS/	O3 profiles	NASA V3.4	QF>0	Not applied	Schwartz et al. (2015)
Aura			No thinning		
OMI/	TCO3	NASA V883	QF>0	Solar elevation	Liu et al. (2010)
Aura			SOE<10°	Global constant	
			Thinned to 0.5°x0.5°		
OMPS (nadir)/	O3 partial columns	NOAA/ Eumetsat V1r0	QF>0	Solar elevation	Flynn et al. (2014)
Suomi NNP			SOE<10°	Global constant	
			No thinning		
SBUV/2/	O3 partial columns	NOAA V8	QF>0	Not applied	Bhartia et al. (1996), McPeters et al. (2013)
NOAA-19			SOE<6°		
			No thinning		
TROPOMI/	TCO3	ESA/ DLR	QF>0	Solar elevation	Loyola et al. (2019 <u>a</u>)
Sentinel-5P		V1.0.0-V1.1.2 (see Table 2)	SOE<10°	Global constant	
			Abs(LAT)<60°		
			Super-obbed to T511		

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 Table 1: O3 satellite retrievals used in this paper. QF= quality flag given by data providers, SOE= Solar Elevation, LAT: Latitude, VarBC: Variational bias correction. The blacklist criteria describe when data were not used.

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Period	Version number	Algorithm	Description of changes	
20171126-20180503	<u>V1.</u> 0 <u>0</u>	Reprocessed with NRT algorithm	N/A (original algorithm)	
20180611-20180718	<u>V1.0.0</u>	<u>NRT</u>	N/A (original algorithm)	
20180718-20180808	<u>V1.1.1</u>	NRT	Minor bugfixes, no	
			algorithm changes.	
			QA_values introduced	
20180808-20181130	<u>V1.1.2</u>	<u>NRT</u>	Bug fix to time variable	
Table 2: Version numbers of	TROPOMI data used in t	his study.		

Instrument	Period	<u>90°-60°N</u>	<u>60°-30°N</u>	<u>30°N-30°S</u>	<u>30°-60°S</u>	<u>60°-90°S</u>
TROPOMI	Nov-May	-1.07 ± 17.30	2.10±9.47	0.06±3.83	-0.05±4.95	<u>-6.81±7.32</u>
<u>OMI</u>	Nov-May	<u>-2.85±8.11</u>	-2.70±7.99	0.18±7.45	0.83±7.35	<u>2.17±6.42</u>
GOME-2A	Nov-May	0.81±6.35	-0.60±5.88	0.06±3.14	<u>-0.10±3.40</u>	0.86±3.38
GOME-2B	Nov-May	0.29±6.25	0.42±6.14	0.16±2.97	-0.19±3.33	-0.46±3.31
TROPOMI	Jun-Nov	<u>-1.46±10.40</u>	0.31±6.00	-0.47±3.88	0.82±10.10	-2.39±6.99
<u>OMI</u>	Jun-Nov	<u>-1.57±7.22</u>	<u>-1.63±7.77</u>	0.48±7.15	0.73±7.95	2.07±6.65
GOME-2A	Jun-Nov	0.19±5.11	-0.25±4.51	0.02±3.55	0.24±5.08	0.67±3.56
GOME-2B	Jun-Nov	0.68±4.80	0.53±4.45	-0.18±3.27	0.04±5.08	-0.29±3.65
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Table 3: Mean bias and standard deviations of the TCO3 retrievals against the CAMS ozone analysis in DU from the control experiment (CTRL) for the periods 26 November 2017 to 3 May 2018 and 11 June to 30 November 2018. Green numbers mark 10

where the biases and standard deviations of the other TCO3 datasets are smaller than TROPOMI's, red marks where they are larger. Shown are 'good' data for TROPOMI and 'used' data for the other instruments.

Instrument	Period	90 <u>°-60</u> °N	<u>60°-30°N</u>	<u>30°N-30</u> °S	<u>30°-60°S</u>	<u>60°-</u> 90°S
(used data)						
TROPOMI	Nov-	Not used	0 <u>51</u> ±6 <u>64</u>	0 <u>07</u> ±2 <u>44</u>	0.003±3.24	Not used
	<u>May</u>					
OMI	Nov-	- <u>3.19+8.09</u>	-3.34±8.25	0 <u>22</u> ±7 <u>42</u>	1 <u>08+</u> 7 <u>21</u>	2.20±6.41
	<u>May</u>					
GOME-2A	Nov-	0.71±6.38	-0 <u>-90</u> ±5 <u>88</u>	0. <u>06±3.13</u>	0. <u>02+3.56</u>	0.86±3.38
	<u>May</u>					
GOME-2B	Nov-	0 <u>20±6.28</u>	0 <u>14±6.27</u>	0.20±3.06	-0 <u>13±343</u>	
	May					0.47±3.31
TROPOMI	<u>Jun-</u>	Not used	0.07±4.09	0.03±2.64	0.29±4.63	Not used
	Nov					
<u>OMI</u>	<u>Jun-</u>	-1.76±7.22	-1.82±7.87	0.67±7.10	0.25±7.75	2.03±6.63
	Nov					
GOME-2A	Jun-	0.17±5.12	<u>-0.15±4.60</u>	0.05±3.77	0.03±5.24	0.59±3.61
	Nov					
GOME-2B	<u>Jun-</u>	0.71±4.80	0.68±4.67	-0.16±3.45	-0.29±5.16	=
	Nov					0.41±3.69

5 Table 4: Mean bias and standard deviations of the TCO3 retrievals against the CAMS ozone analysis in DU from the assimilation experiment (ASSIM for the periods 26 November 2017 to 3 May 2018 and 11 June to 30 November 2018 for 'used' data. Green numbers mark where the biases or standard deviations are smaller in ASSIM than in CTRL (Table 3), red numbers mark where they are larger.

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Figure 1: TROPOMI NRT TCO3 in Dobson Units (DU) at (a) full resolution and (b) super-obbed to the model resolution of T511 on 20171129, 12z over Europe.



10 Figure 2: (a) <u>Timeseries of zonal mean weekly averaged TROPOMI NRT TCO3 for</u> the period 26 November 2017 to <u>30 November</u> 2018 and <u>differences between</u> (b) <u>TROPOMI and OMI</u>, (c) <u>TROPOMI and GOME-2A</u> and (d) <u>TROPOMI and GOME-2B_TCO3</u>. Shown are 'good data, <u>All values in DU</u>.



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Figure 4: TCO3 standard deviation <u>of 'good' data</u> for the period 26 November 2017 to <u>30 November 2018 from (a) TROPOMI, (b)</u> OMI, (c) GOME-2A and (d) GOME-2B in DU.

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Figure 5: (a) Timeseries of zonal mean weekly averaged TROPOMI TCO3 analysis departures (observations minus analysis) for the period 26 November 2017 to 30 November 2018. The red dashed lines mark changes in the retrieval versions (see Table 2). (b) Mean TROPOMI TCO3 analysis departures averaged over FMA 2018 and (c) mean analysis departures averaged over SON 2018 (compare with Figure 5). 2018. Shown are 'good' data. All values in DU. Values smaller than 2DU are white.



Figure 6: <u>Scatter plots of 'good'</u> TROPOMI NRT TCO3 analysis departures against (1) latitude, (2) solar elevation and (3) scan position for (a) FMA 2018, and (b) SON 2018. Values are in DU.

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.. (b)









Figure 10: Cross section of relative zonal mean O₃ mixing ratio differences from ASSIM minus CTRL averaged over (a) FMA 2018 and (b) SON 2018 in %.

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5 Figure 13: Mean relative O₃ bias for SON 2018 in % between ASSIM (red) and CTRL (blue) and ozone sondes averaged over the (a) Globe, (b) Arctic, (c) NH midlatitudes, (d) Tropics, (e) SH midlatitudes and (f) Antarctic.







