This document contains:

- Responses to Review #1
- Responses to Review #2
- Responses to Review #3
- Marked-up file (\*) showing differences between the submitted manuscript and the revised manuscript.

To address overlapping comments from all three reviews, we have performed an additional analysis to quantify bias produced by differences between MOPITT *a priori* CO profiles and TROPOMI reference CO profiles. We did so by applying a null-space adjustment (based on the MOPITT *a priori*) to TROPOMI. Our results show that bias values change by only 1-2 percentage points respect to the original bias values.

In summary: we have added a new Section 3.1 discussing in more detail the differences between the MOPITT and TROPOMI CO retrieval algorithms, as well as the challenges these differences impose when comparing the two datasets. New Section 3.3.1 discusses the main sources of error in satellite CO retrievals and sources of error when comparing satellite datasets (i.e., differences in *a priori* and AKs). New Sections 4.1.4 and 4.2.3, and new Tables 4 and 5, summarize biases between MOPITT and null-space adjusted TROPOMI over land and ocean. For focus, we have moved the above/below cloud TROPOMI/MOPITT ocean analysis to Supplement Materials. We merged parts of Fig. 10 and 11 into a new Fig. 10 which illustrates our comparison of TROPOMI/MOPITT total CO columns over oceans.

(\*) Please note that latexdiff, the tool that produces the marked-up file, has issues dealing with changes in LaTeX syntax associated with citations (not dealing with changes in the citations themselves). Latexdiff can still produce a marked-up file in these cases, if executed with the option to ignore citations (--disable-citation-markup). The resulting marked-up file, as a consequence, shows "(?)" where the citations should be; we apologize for this and we would like to emphasize that most citations have remained unchanged in the manuscript. Unfortunately, we find that other references (to equations, tables, and figures) as well as tables themselves are affected in a similar manner, despite the fact that they haven't been modified (except for Fig. 10 and new Tables 4 and 5).

# Responses to Review #1

We appreciate your comments. Please find our responses below. Line numbers refer to the manuscript as submitted for the discussion phase.

Interactive comment on "1.5 years of TROPOMI CO measurements: Comparisons to MOPITT and ATom" by Sara Martínez-Alonso et al.

Anonymous Referee #1

Received and published: 6 April 2020

## **General Comments:**

The authors provided a validation for the TROPOMI CO observations by using MOPITT and Atom CO measurements. I found the paper is well written. The authors demonstrated good agreement between TROPOMI and MOPITT CO observations, which is helpful for people who are interested in the sources and variations of CO from global to regional scales. I recommend the paper for publication after consideration of the minor points below.

# **Specific Comments:**

1. Lines 154-160: It is difficult to follow this paragraph. I checked Section 2 again but didn't find the details to support the direct comparison without transformation. It would be better to provide more details here.

Thank you for this comment. New text and two tables with results from an additional analysis have been included in the manuscript to 1) better justify the direct comparisons without transformation and 2) investigate the effect on biases of the differences between MOPITT *a priori* CO profiles and TROPOMI reference CO profiles. New Section 3.1 discusses in more detail the differences between the MOPITT and TROPOMI CO retrieval algorithms, as well as the challenges these differences impose when comparing the two datasets. New Section 3.3.1 discusses the main sources of error in satellite CO retrievals; it also discusses sources of error when comparing satellite datasets, e.g., differences in *a priori* information used by each dataset and differences in vertical sensitivity (represented by the averaging kernels, or AKs) between instruments.

Determining whether or not observed differences in retrievals from these two instruments are consistent with differences in their *a priori*, AKs, and instrument noise would require knowledge of the true atmosphere during observation; this information is often unavailable, here included. Our main goal in comparing MOPITT and TROPOMI total CO column retrievals is to quantify differences between the two retrieval products available to users, rather than quantify the actual bias of either product. This goal is addressed by direct "end to end" comparisons of the two untransformed products in various regions of interest, after colocation of the MOPITT and TROPOMI retrievals. These comparisons quantify the MOPITT/TROPOMI difference statistics due to all effects: AK differences, *a priori* differences, and instrument noise.

Additionally, we now investigate the effects of differences between the *a priori*/reference information used by MOPITT and TROPOMI in their retrievals; we do so by applying a null-space adjustment (based on the MOPITT *a priori*) to TROPOMI. We present results from this additional analysis in Sections 4.1.4 and 4.2.3 and show that differences in *a priori*/reference CO profiles affect MOPITT/TROPOMI relative biases by 1-2 percentage points, well below TROPOMI's required 15% accuracy.

2. Section 4.1. The comparison between TROPOMI and MOPITT is very interesting. I have some suggestions, which may be considered in this work or the following study: 1) The differences between two datasets show obvious seasonal variabilities. What are the possible explanations? We thank you for this observation. The following text has been added to address this point (line 363): "There appears to be a seasonal component in MOPITT/TROPOMI bias values in the two hemispheric ROIs and Australia, Polluted ROIs (USA, Europe, India, China) and the Sahara do not seem to be affected (Fig. 3, 4, and 5). Biases between MOPITT and null-space adjusted TROPOMI retrievals show the same seasonal component, indicating that it is not caused by the MOPITT *a priori*. The seasonal variability of MOPITT has been validated in the past using ground-based measurements. In their comparison to NDACC data (Network for the Detection of Atmospheric Composition Change; De Maziere et al., 2018), Buchholz et al. (2017) found no significant seasonally dependent bias for MOPITT products. Hedelius et al. (2019) compared MOPITT to the TCCON dataset, reporting no persistent seasonal trend globally and some seasonal variability for individual sites. Further work will be needed to identify the origin of a possible seasonal component in MOPITT-TROPOMI bias values." 2) We know that MOPITT show some latitude-depended differences relative to surface and aircraft measurements. Do the differences between TROPOMI and MOPITT have similar latitudinal dependence? It has, indeed, been shown that V7 MOPITT TIR products exhibited a latitudinal dependence in partial CO column biases; the latitudinal dependence in total column biases was less prominent (see Fig. 2 from Deeter et al., 2019, shown below). This latitudinal dependence of biases could have been caused by issues in modeled water vapor absorption in the MOPITT TIR passband (Edwards et al., 1999) or accuracy of water vapor data used in the MOPITT retrieval (Pan et al., 1995; Wang et al., 1999). According to Deeter et al. (2019), "MOPITT V8 biases [...] do not exhibit a clear latitudinal dependence"; this is particularly the case for total column values (see Fig. 6 from Deeter et al., 2019, shown below). Enhancements in the V8 retrieval algorithm addressing this issue include updated spectroscopic information used by the radiative transfer model and improved radiance bias correction. We have added wording to the MOPITT description section to clarify this point (page 5, line 116): "Here we use daytime archive MOPITT data from version 8 (Deeter et al., 2019); among other improvements, V8 products do not exhibit a latitudinal dependence in partial CO column biases observed in V7."

## References

Deeter, M. N., Edwards, D. P., Francis, G. L., Gille, J. C., Mao, D., Martinez-Alonso, S., Worden, H. M., Ziskin, D., and Andreae, M. O. (2019) Radiance-based retrieval bias mitigation for the MOPITT instrument: the version 8 product, Atmospheric Measurement Techniques, 12, 4561–4580, https://doi.org/10.5194/amt-12-4561-2019.

Edwards, D. P., Halvorson, C. M., and Gille, J. C. (1999) Radiative transfer modeling for the EOS Terra satellite Measurements of Pollution in the Troposphere (MOPITT) instrument, J. Geophys. Res., 104, 16755–16775, <a href="https://doi.org/10.1029/1999JD900167">https://doi.org/10.1029/1999JD900167</a>.

Pan, L., Edwards, D. P., Gille, J. C., Smith, M. W., and Drummond, J. R. (1995) Satellite remote sensing of tropospheric CO and CH 4: forward model studies of the MOPITT instrument, Appl. Opt., 34, 6976–6988, https://doi.org/10.1364/AO.34.006976.

Wang, J., Gille, J. C., Bailey, P. L., Drummond, J. R., and Pan, L. (1999) Instrument sensitivity and error analysis for the remote sensing of tropospheric carbon monoxide by MOPITT, J. Atmos. Ocean. Tech., 16, 465–474, https://doi.org/10.1175/1520-0426(1999)016%3C0465:ISAEAF%3E2.0.CO;2.

Interactive comment on Atmos. Meas. Tech. Discuss., doi:10.5194/amt-2020-63, 2020.

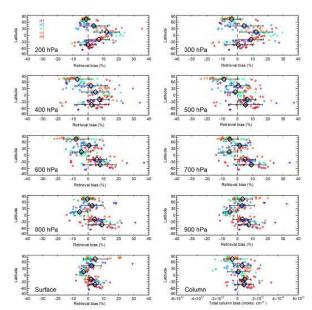


Figure 2. Latitude dependence of V7 TIR-only biases based on the HIPPO CO profiles. Results from each of the five stages of HIPPO are color-coded, as indicated by the key in the top-left panel. Large black diamonds and error bars in each panel indicate bias statistics (mean and standard deviation) representing each 30° wide latitudinal zone.

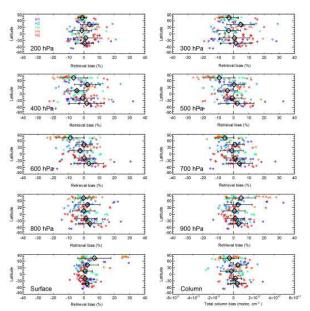


Figure 6. Latitude dependence of V8 TIR-only biases (expressed in percent) based on the HIPPO CO profiles. See caption to Fig. 2.

# Responses to Review #2

Thank you for your comments. Please find our responses below. Page and line numbers refer to the manuscript as submitted for the discussion phase.

Interactive comment on "1.5 years of TROPOMI CO measurements: Comparisons to MOPITT and ATom" by Sara Martínez-Alonso et al.

Anonymous Referee #2

Received and published: 6 April 2020

This manuscript compares TROPOMI carbon monoxide retrievals to data from the MOPITT satellite and in situ airborne profiles (ATom-4). The manuscript is well written and falls into the scope of AMT. I recommend publication after the following comments have been addressed.

# **General Comments**

My main concern is that the significantly different vertical sensitivities of the instruments and the different apriori profiles used in the algorithms are not taken into account in the comparison of the TROPOMI and MOPITT data. It is alleged that the corresponding comparison methodology is not applicable to profile scaling retrievals. However, I do not agree with this view as TROPOMI's averaging kernels (AKs) take into account that it is a profile scaling retrieval. The AK value of the i-th layer quantifies as usual the sensitivity of the total column to a change of CO in the i-th layer. It is also not a question of constraining the results with the apriori or not. If the AKs are not a direct output of the retrieval, you can simply compute them for every kind of algorithm by confronting the retrieval with simulated measurements and doing the following for each layer i: 1) change the abundance in the i-th layer, 2) perform the retrieval, 3) compare the retrieved column to the "true" column. For a meaningful comparison, at least the individual apriori profiles of both retrievals should be replaced by a common prior by using the AKs (see e.g. Section 4 of Rodgers and Connor (2003) or Appendix A of Wunch et al. (2011)). The common prior can be the TROPOMI prior, the MOPITT prior, or a different third prior. Please improve the comparison method by taking these aspects into account or give a justification why the consideration of the AKs is negligible in this analysis and prove by example that the figures of merit like the global bias between the two data sets do not critically depend on whether the individual apriori profiles are replaced by a common prior.

Thank you for this comment. New text and two tables with results from an additional analysis have been included in the manuscript to 1) better justify the direct comparisons without transformation and 2) investigate the effect on biases of the differences between MOPITT *a priori* CO profiles and TROPOMI reference CO profiles. New Section 3.1 discusses in more detail the differences between the MOPITT and TROPOMI CO retrieval algorithms, as well as the challenges these differences impose when comparing the two datasets. New Section 3.3.1 discusses the main sources of error in satellite CO retrievals; it also discusses sources of error when comparing satellite datasets, e.g., differences in *a priori* information used by each dataset and differences in vertical sensitivity (represented by the averaging kernels, or AKs) between instruments.

Determining whether or not observed differences in retrievals from these two instruments are consistent with differences in their *a priori*, AKs, and instrument noise would require knowledge of the true atmosphere during observation; this information is often unavailable, here included. Our main goal in comparing MOPITT and TROPOMI total CO column retrievals is to quantify differences between the two retrieval products available to users, rather than quantify the actual bias of either product. This goal is addressed by direct "end to end" comparisons of the two untransformed products in various

regions of interest, after colocation of the MOPITT and TROPOMI retrievals. These comparisons quantify the MOPITT/TROPOMI difference statistics due to all effects: AK differences, *a priori* differences, and instrument noise.

Additionally, we now investigate the effects of differences between the *a priori*/reference information used by MOPITT and TROPOMI in their retrievals; we do so by applying a null-space adjustment (based on the MOPITT *a priori*) to TROPOMI. We present results from this additional analysis in Sections 4.1.4 and 4.2.3 and show that differences in *a priori*/reference CO profiles affect MOPITT/TROPOMI relative biases by 1-2 percentage points, well below TROPOMI's required 15% accuracy.

# **Specific Comments**

Page 1, Lines 4-5: TANSO-FTS-2 on the GOSAT-2 satellite (launched in 2018) is also deriving CO from solar reflected radiances in the 2.3 μm spectral region. Thank you for bringing this point to our attention; similarly, SCIAMACHY should also have been included in the list of satellite instruments that derived CO from solar reflected radiances. We have reworded the sentence as follows: "MOPITT and TROPOMI are two of only a few satellite instruments to ever derive CO from solar reflected radiances." We have also added an introduction to SCIAMACHY and TANSO-FTS-2 later on in the manuscript, please see below.

Page 1, Lines 16-17: see general comments. Please note that, for focus, we have moved the MOPITT/TROPOMI above and below cloud comparison to the Supplement Materials. Because of this, the Abstract now does not refer to this particular type of comparison. Please see response to General Comments for more details.

Page 3, Lines 49-50: TANSO-FTS-2 on the GOSAT-2 satellite is also deriving CO from solar reflected radiances in the 2.3 μm spectral region. To address this point we have reworded the sentence in lines 49-50 and introduced both SCIAMACHY and TANSO-FTS-2 as follows: "TROPOMI was, until recently, the only other operative satellite instrument retrieving CO from NIR measurements. (ENVISAT SCIAMACHY (2002-2012; Bovensmann et al., 1999) and GOSAT-2 TANSO-FTS-2 (since 2019; NIES, 2019) are two other instances.) Thus, understanding how MOPITT and TROPOMI retrievals compare to each other is important."

Page 7, Lines 157-160: see general comments. The content of these lines regarding MOPITT and TROPOMI algorithm differences has been expanded and clarified in new Section 3.1. Please see our response to General Comments for additional details.

# Page 8, Line 195: The units in Eq. (1) do not match.

For added clarity and to show explicitly that units do match, we now provide the units of the constant 2.12\*10<sup>13</sup>, which are molec. cm<sup>-2</sup> hPa<sup>-1</sup> ppb<sup>-1</sup>. (Please note that Eq. 1 is now Eq. 3.)

Page 9, Lines 223-225: Why not use the actual TROPOMI averaging kernels here instead of a binary step function? Please note that, for focus, the analysis described in Section 3.2.2 has been moved to Supplement Materials. The purpose of the method described in Section 3.2.2. is to calculate the worst-case scenario errors (the maximum errors) that could be introduced by the use of modeled CO in TROPOMI retrievals over water. In a way, the method can be understood better by thinking of a step function, since it is assumed that TROPOMI sensitivity to CO above cloud top would be 1 (i.e., no modeled CO involved), while below cloud top would be 0 (i.e., only modeled CO involved). As stated

in the manuscript, this method would be most accurate in case of optically thick clouds. To explain the motivation for this section better and thus clarify this point, we have reworded the text as follows (page 9, lines 223-227): "The goal of this analysis was to calculate the maximum error caused by the use of reference CO profiles in TROPOMI retrievals over water. To this effect, we assumed that TROPOMI retrievals are only sensitive to CO above cloud top, while CO below cloud top is fully approximated by TROPOMI's scaled reference profiles. This scenario would be most accurate in case of optically thick clouds. To quantify this error, we compared TROPOMI retrievals over bodies of water (total columns and their above cloud partial column components) to their colocated MOPITT TIR counterparts."

Page 10, Lines 242-243: Why not use the actual TROPOMI averaging kernels? Please see response to previous comment. To explain the motivation for this section better and thus clarify this point, we have reworded the text as follows (Supplement Materials page 2, lines 43-44): "The goal of this analysis was to calculate the maximum error caused by the use of reference CO profiles in TROPOMI retrievals over water. To this effect, [...]"

Page 13, Lines 342-343: The negative bias could simply be a consequence of the different sensitivities and apriori profiles used in the estimation of the true atmospheric state for the two individual instruments. Thus, consideration of the averaging kernels is important. Please note for example the change in sign for the biases in Figure 6 due to the AKs. Thank you for this comment. New Table 4 shows that land MOPITT/TROPOMI bias values after accounting for *a priori* differences are very similar to (and retain the same negative sign as) the original bias values shown in Table 1 and discussed in lines 342-343. As discussed in the response to General Comments, the effect of *a priori*/reference CO profile differences on relative biases is very small, only 1-2 percentage points.

Page 14, Lines 378-380: How do these error estimates change when considering the averaging kernels and apriori profiles? Please note that, for focus, we have moved the MOPITT/TROPOMI above and below cloud comparison to the Supplement Materials. Because of this, the Discussion section now does not refer to this particular type of comparison. The manuscript does, however, still include a comparison of MOPITT/TROPOMI total CO column values over ocean plus its MOPITT/null-space adjusted TROPOMI comparison counterpart. New Table 5 shows that ocean MOPITT/TROPOMI total column bias values after accounting for *a priori* differences are very similar to the original bias values (shown in Table 3) and retain the same sign.

Page 14, Lines 384-386: In addition to the global accuracy and precision, it would also be interesting to quantify the regional relative accuracy quantifying region-to-region biases, e.g. the standard deviation of the individual biases for the regions of Figures 2-5. We assume that "region-to-region" (here and in other comments below) means "for each ROI". Please note that the bias (accuracy) and standard deviation of bias (precision) had been quantified for each ROI, both in percentage and in CO column values; results are summarized in Table 1, described in the Results section, and revisited in the Discussion section. (We assume the comment refers to Fig. 3-5.) The precision requirement of 10 % is not satisfied. Thank you for pointing this out. Calculated precision versus required precision had been discussed elsewhere in the manuscript (e.g., page 13 lines 341-342 and 366-367). However, the wording in page 14 lines 384-386 is indeed insufficient. For clarity, the sentence has been reworded to: "Our results show that the accuracy of TROPOMI retrievals with respect to MOPITT and ATom far exceeds Sentinel-5P mission requirements (Veefkind et al., 2012; Landgraf et al., 2016). The precision values calculated for some of the ROIs analyzed surpass the target value by a few percent."

Page 14, Line 390: To validate TROPOMI retrievals over land, ground-based measurements from the Total Carbon Column Observing Network (TCCON), which are calibrated using aircraft profiles, can also be used. In contrast to aircraft data this would also allow the validation of seasonal variability at a fixed location. We agree, thanks for bringing this point up. To address this comment we have reworded/added the following text in the manuscript: "To that end, *in situ* data from other airborne measurement programs are required. Ground-based measurements (e.g., NDACC, TCCON) could also be used; this would allow the validation of seasonal variability at fixed locations."

Page 14, Line 392-393: I would call a comparison to other satellite data sets verification instead of validation. Thank you for this comment. We have reworded this sentence as follows: "The MOPITT dataset represents the longest global CO record available (2000-present); because of extensive validation efforts with respect to *in situ* measurements and comparisons with other satellite datasets, it is well characterized." Has the seasonal variability of MOPITT also been validated, e.g. by using TCCON or NDACC ground-based measurements? MOPITT has been compared in the past to ground measurements, as discussed in page 3 line 52. (In that line, for simplicity and focus, neither the names of these ground networks nor the names of the individual satellite datasets used in previous MOPITT validations are provided.) We have added elsewhere (page 13, line 363) the following text describing these previous efforts: "The seasonal variability of MOPITT has been validated in the past using ground-based measurements. In their comparison to NDACC data (Network for the Detection of Atmospheric Composition Change; De Maziere et al., 2018), Buchholz et al. (2017) found no significant seasonally dependent bias for MOPITT products. Hedelius et al. (2019) compared MOPITT to the TCCON dataset, reporting no persistent seasonal trend globally and some seasonal variability for individual sites." Relevant references have been added to the manuscript.

Page 14, Line 395-396: TANSO-FTS-2 on the GOSAT-2 satellite is also deriving CO from solar reflected radiances in the  $2.3~\mu m$  spectral region. Thanks for pointing that out. We have reworded the sentence as follows: "Furthermore, TROPOMI and MOPITT were, until TANSO-FTS-2 became operational in 2019, the only working satellite instruments retrieving CO from NIR solar-reflected radiances."

Page 14, Line 399: Please replace "do not fully account for" by "do not account for". Done.

Page 15, Line 408: What about transport of CO from major sources in coastal regions to the ocean? Thanks for this observation. We have address the comment as follows: "Since there are no major CO sources over water, CO values closer to the surface (and, therefore, most likely to be below cloud top) tend to be spatially homogeneous and stable through time. Thus, they are well characterized by the reference profiles. (Caution should be exercise in case of sporadic CO sources near open water, e.g., fires near a coastline, which could in some cases result in plumes transported off the coast and below cloud top. Larger errors could occur in such retrievals over water, if sources were not well represented in the TM5 model.)"

Page 15, Line 411-412: or validation with ground-based measurements (TCCON or NDACC). Reworded to "These errors require further characterization with colocated *in situ* data and ground measurements over land."

Figures 3-5: Please add regional mean bias and standard deviation of the differences to all individual subplots. Figures 3-5 currently show daily mean of regional bias for each ROI. Please note that regional mean bias values for each ROI and each MOPITT product (TIR, NIR, and TIR+NIR) are shown in Fig.

13. Adding this information to Fig. 3-5 would be redundant and would make these figures harder to read. Regional standard deviations for each ROI and each MOPITT product are also shown in Fig. 13; adding this information to Fig. 3-5 would make these figures harder to read.

Figures 13-14: Please add the standard deviation of the individual regional biases as a measure of the region-to-region bias to the plots (for TIR, NIR, and TIR+NIR). Please note that Fig. 13 shows results for colocated retrievals while Fig. 14 shows results for non colocated retrievals. The solid black lines in Fig. 13 represent, for each ROI, the standard deviation derived from individual biases between each pair of colocated observations. We have added a few words early in the manuscript (Methods section, page 7, line 168) to clarify this point: "We quantified, among others, daily bias (i.e., accuracy) and standard deviation (i.e., precision; calculated from individual biases between each pair of colocated observations) between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR)." In contrast, the dashed lines (not "solid lines"; caption has been corrected accordingly, here and in Supplement Materials) in Fig. 14 represent, for each ROI, ±1 standard deviation of mean daily relative biases (i.e., inter-daily bias variability). In this case a standard deviation cannot be calculated from individual biases between each pair of colocated observations, since no colocation was performed.

Table 1: Please add region-to-region biases in case "all ROIs". Please note that Table 1 already contains, for each ROI, the biases as well as the standard deviation of the individual biases, both in percentage and in CO column values.

# **Technical Corrections**

Page 3, Line 50: Please rephrase "is key." Reworded to "is important".

Page 8, Line 195: Please replace 
$$\sum_{i=1}^{i=n} ...$$
 by  $\sum_{i=1}^{n} ...$  in Eq.(1). Thank you. The equation (now Eq. 3) has been slightly simplified and pow it does not include a summation symbol.

has been slightly simplified and now it does not include a summation symbol.

Page 13, Line 340: Please add the unit % for the relative biases. Done.

# References

Rodgers, C. D. and Connor, B. J.: Intercomparison of remote sounding instruments, J. Geophys. Res., 108, D3, 4116, https://doi.org/10.1029/2002JD002299, 2003.

Wunch, D., Wennberg, P. O., Toon, G. C., Connor, B. J., Fisher, B., Osterman, G. B., Frankenberg, C., Mandrake, L., O'Dell, C., Ahonen, P., Biraud, S. C., Castano, R., Cressie, N., Crisp, D., Deutscher, N. M., Eldering, A., Fisher, M. L., Griffith, D. W. T., Gunson, M., Heikkinen, P., Keppel-Aleks, G., Kyro, E., Lindenmaier, R., Macatangay, R., Mendonca, J., Messerschmidt, J., Miller, C. E., Morino, I., Notholt, J., Oyafuso, F. A., Rettinger, M., Robinson, J., Roehl, C. M., Salawitch, R. J., Sherlock, V., Strong, K., Sussmann, R., Tanaka, T., Thompson, D. R., Uchino, O., Warneke, T., and Wofsy, S. C.: A method for evaluating bias in global measurements of CO2 total columns from space, Atmos. Chem. Phys., 11, 12317-12337, https://doi.org/10.5194/acp-11-12317-2011, 2011.

Interactive comment on Atmos. Meas. Tech. Discuss., doi:10.5194/amt-2020-63, 2020.

# Responses to Review #3

We thank you for your comments, please find responses below. Line numbers refer to the manuscript as submitted for the discussion phase.

Interactive comment on "1.5 years of TROPOMI CO measurements: Comparisons to MOPITT and ATom" by Sara Martínez-Alonso et al.

Anonymous Referee #3

Received and published: 2 May 2020

The authors have conducted a validation of TROPOMI CO retrievals using data from MOPITT and aircraft profiles of CO from ATom. The TROPOMI data are fairly new and provide tremendous observational coverage at high spatial resolution. However, MOPITT offers a uniquely long record of space-based measurements of CO, therefore there is significant value in the validation analysis presented here. My main concern is that when comparing two remote sensing data sets it is critical to account for the influence of the a priori profiles on the retrievals and for the different vertical sensitivities of the measurements, which was not done in this study. The manuscript is well written and appropriate for AMT. I would recommend publication of the manuscript after the authors have addressed my comments below.

# **General Comments**

1. Lines 111-114: The discussion here is somewhat confusing. The authors state that the NIR retrievals are significantly constrained by the a priori, whereas the TIR are less strongly weighted by the a priori profile. However, on lines 159-160 they explain that they do not transform the MOPITT and TROPOMI profiles when comparing them. It would seem that the different contributions of the a priori to the two sets of retrievals would necessitate accounting for the influence of the a priori profiles to meaningfully compare the two data sets. What is the justification for neglecting this?

Thank you for this comment. New text and two tables with results from an additional analysis have been included in the manuscript to 1) better justify the direct comparisons without transformation and 2) investigate the effect on biases of the differences between MOPITT *a priori* CO profiles and TROPOMI reference CO profiles. New Section 3.1 discusses in more detail the differences between the MOPITT and TROPOMI CO retrieval algorithms, as well as the challenges these differences impose when comparing the two datasets. New Section 3.3.1 discusses the main sources of error in satellite CO retrievals; it also discusses sources of error when comparing satellite datasets, e.g., differences in *a priori* information used by each dataset and differences in vertical sensitivity (represented by the averaging kernels, or AKs) between instruments.

Determining whether or not observed differences in retrievals from these two instruments are consistent with differences in their *a priori*, AKs, and instrument noise would require knowledge of the true atmosphere during observation; this information is often unavailable, here included. Our main goal in comparing MOPITT and TROPOMI total CO column retrievals is to quantify differences between the two retrieval products available to users, rather than quantify the actual bias of either product. This goal is addressed by direct "end to end" comparisons of the two untransformed products in various regions of interest, after colocation of the MOPITT and TROPOMI retrievals. These comparisons quantify the MOPITT/TROPOMI difference statistics due to all effects: AK differences, *a priori* differences, and instrument noise.

Additionally, we now investigate the effects of differences between the *a priori*/reference information used by MOPITT and TROPOMI in their retrievals; we do so by applying a null-space adjustment (based on the MOPITT *a priori*) to TROPOMI. We present results from this additional analysis in

Sections 4.1.4 and 4.2.3 and show that differences in *a priori*/reference CO profiles affect MOPITT/TROPOMI relative biases by 1-2 percentage points, well below TROPOMI's required 15% accuracy.

- 2. Lines 162-163: What is the impact of the differences in the overpass times of TROPOMI and MOPITT when selecting "collocated" pairs of data? Quantifying this for the ROIs selected in the study would be helpful for interpreting the results of the intercomparison. Quantifying the effect of differences in passing times in CO retrievals is an interesting topic, but it is outside the scope of this work. Please note that validation papers allow time differences substantially larger than the 3 hours between MOPITT and TROPOMI, e.g., Deeter et al., 2019 (12 hours); Clerbaux et al, 2008 (24 hours). The lifetime of CO (several weeks) is much greater than the time difference between MOPITT and TROPOMI passing times. Differences in total CO column amounts due to transportation would be equally likely to be positive or negative; thus, they would not contribute to an apparent bias between the two products.
- 3. Lines 307-308: What is the implication of the tendency of the reference profiles to have too much CO near the surface for the intercomparison with MOPITT, considering that no attempt is made to mitigate potential biases arising from the a priori? Thank you for this comment. Please see response to Comment #1 above. As explained there, the manuscript now includes text describing (and results from) an additional analysis where we quantify the effect on biases of the differences between MOPITT *a priori* CO profiles and TROPOMI reference CO profiles. We show that differences in *a priori*/reference CO profiles affect MOPITT/TROPOMI relative biases by 1-2 percentage points, well below TROPOMI's required 15% accuracy.
- 4. Lines 354-357: It is certainly possible that the differences in overpass times could contribute to these biases over Africa, but this can be confirmed with a model, for example. Modeling the effect of differences in passing times in CO retrievals is an interesting topic, but it is outside the scope of this work. Also, please note that lines 354-357 discuss results obtained for the China ROI; furthermore, please note that the ROIs analyzed in this work do not include fire regions in Africa. Furthermore, what about the impact of the different vertical sensitivities of the measurements here? It seems critical to me to account for the influence of the averaging kernels before speculating that these differences could be due to temporal variations in the African fires. Thank you for this comment. Please see response to Comment #1 for more details regarding additional text now included in the manuscript to address this point.

# **Technical Comments**

- 1) Line 46: This is not the first use of the acronym MOPITT. Thank you for catching this. We have reworded lines 33-35 to include definitions of TROPOMI, MOPITT, and ATom the first time they are mentioned in the Introduction: "The aim of this work is to facilitate the extension of the current satellite record with newly available TROPOMI (TROPOspheric Monitoring Instrument) measurements by evaluating those with respect to satellite MOPITT (Measurements Of Pollution In The Troposphere) and *in situ* ATom (Atmospheric Tomography mission) CO data." Also, the MOPITT and ATom acronym definitions in lines 46-47 have been removed and the sentence reworded to: "Here we analyze daily global TROPOMI retrievals acquired between 7 November 2017 and 10 March 2019 with respect to MOPITT and ATom."
- 2) Line 110: Please insert "the" before "total column AK". Please note line 110 does not contain the text "total column AK". That text appears, though, in lines 109 and 111; we have added "the" to the

latter occurrence. That sentence now reads: "With respect to vertical sensitivity, the total column AK for the NIR-only product are most similar in shape to the TROPOMI total column AK"

3) Line 119: Please make it clear that "( $\sim$ 480; note 1 km resolution)" here is referring to the number of MODIS observation, and that these observations have a resolution of 1 km. Thank you for this comment. For increased clarity that sentence has been reworded to: "The  $\sim$ 480 MODIS observations at 1 x 1 km² horizontal resolution acquired at the same time as a single MOPITT observation and within the MOPITT footprint are identified and collected"

Interactive comment on Atmos. Meas. Tech. Discuss., doi:10.5194/amt-2020-63, 2020.

# 1.5 years of TROPOMI CO measurements: Comparisons to MOPITT and ATom

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Abstract. We have analyzed TROPOspheric Monitoring Instrument (TROPOMI) carbon monoxide (CO) data acquired between November 2017 and March 2019 with respect to other satellite (MOPITT, Measurement Of Pollution In The Troposphere) and airborne (ATom, Atmospheric Tomography mission) datasets to understand better TROPOMI's contribution to the global tropospheric CO record (2000 to present). TROPOMI and MOPITT are currently the only satellite instruments deriving MOPITT and TROPOMI are two of only a few satellite instruments to ever derive CO from solar reflected radiances. Therefore, it is particularly important to understand how these two datasets compare. Our results indicate that TROPOMI CO retrievals over land show excellent agreement with respect to MOPITT: relative biases and their standard deviation (i.e., accuracy and precision) are on average  $-3.73 \pm 11.51$ ,  $-2.24 \pm 12.38$ , and  $-3.22 \pm 11.13$ %, compared to the MOPITT TIR (thermal infrared), NIR (near infrared), and TIR+NIR (multispectral) products, respectively. TROPOMI and MOPITT data also show good agreement in terms of temporal and spatial patterns.

Despite depending on solar reflected radiances for its measurements, TROPOMI can also retrieve CO over bodies of water if clouds are present, by approximating partial columns under cloud tops using scaled, model-based reference CO profiles. We quantify the bias of TROPOMI total column retrievals over bodies of water with respect to colocated *in situ* ATom CO profiles after smoothing the latter with the TROPOMI column averaging kernels (AK), which account for signal attenuation under clouds (relative bias and its standard deviation =  $3.25 \pm 11.46 \%$ ). In addition, we quantify  $e_{null}$  (the null-space error), which accounts for differences between the shape of the TROPOMI reference profile and that of the ATom true profile ( $e_{null} = 2.16 \pm 2.23 \%$ ). For comparisons of TROPOMI and MOPITT retrievals over open water, we adopt a simpler approach, since smoothing with TROPOMI AK does not apply for MOPITT retrievals. To this effect, we we compare TROPOMI total CO columns (above and below cloud tops) and partial CO columns (above cloud top) to their colocated MOPITT TIR coun-

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terparts. (This approximation would be most accurate for optically thick clouds.) We find very small changes in relative bias between TROPOMI and MOPITT TIR retrievals if total columns are considered instead of partial above-cloud-top columns (<1 percentage point) Relative bias and its standard deviation are 2.98 ± 15.71 % on average.

We investigate the impact of discrepancies between the *a priori* and reference CO profiles (used by MOPITT and TROPOMI, respectively) on CO retrieval biases by applying a null-space adjustment (based on the MOPITT *a priori*) to the TROPOMI total column values. The effect of this adjustment on MOPITT/TROPOMI biases is minor, typically 1-2 percentage points.

## 1 Introduction

Even though carbon monoxide (CO) constitutes less than one millionth of the troposphere in volume, it is of great importance to understand climate and to monitor and predict air quality. Tropospheric CO is produced by incomplete fuel combustion, biomass burning, and oxidation of methane and other hydrocarbons. CO's main sink is oxidation by the hydroxyl radical (OH) (??); this reaction produces greenhouse gases such as carbon dioxide and tropospheric ozone. Additionally, OH engaged in reactions with CO is not available to scavenge other greenhouse gases such as methane, which then have a longer lifetime in the atmosphere. As a consequence, CO emissions have a positive indirect radiative forcing of 0.23 W/m² (?). The mean lifetime of tropospheric CO (variable by season and latitude, in addition to other factors; ?) is approximately 2 months. Because of its average lifetime, -long enough to last through horizontal and vertical transport and, yet, short enough not to become well mixed-, it is often used as a tracer to monitor the distribution, transport, sources, and sinks of polluted plumes (e.g., ?). A self-consistent, uninterrupted record of global tropospheric CO is, thus, key to both climate and air quality studies. The aim of this work is to facilitate the extension of the current satellite record with newly available TROPOMI data (TROPOspheric Monitoring Instrument) measurements by evaluating those with respect to MOPITT satellite and ATom aircraft satellite MOPITT (Measurements Of Pollution In The Troposphere) and *in situ* ATom (Atmospheric Tomography mission) CO data.

The pre-launch targets for TROPOMI total CO column accuracy and precision were 15 and 10 %, respectively, for both clear and low-altitude-cloud observations (??). Retrieval errors are expected to be larger for cloudy conditions due to several effects, including the shape of model-based reference profiles (?). Global comparisons of TROPOMI retrievals with respect to ECMWF/IFS (European Center for Medium-Range Weather Forecast/Integrated Forecasting System) CO assimilation results (which incorporate CO retrievals from MOPITT as well as from IASI, the Infrared Atmospheric Sounding Interferometer (?)) showed a relative high bias of 3.2 % with standard deviation of 5.5 % (?). TROPOMI CO retrievals over land have also been previously compared to ground-based measurements from nine TCCON ((Total Carbon Column Observing Network)-;

?) stations for selected dates between 9 November 2017 and 4 January 2018; good agreement between both datasets was found, with the TROPOMI CO product well within the mission requirements (?). Here we analyze daily global TROPOMI retrievals acquired between 7 November 2017 and 10 March 2019 with respect to satellite (MOPITT, Measurements Of Pollution In The Troposphere) and airborne (ATom, Atmospheric Tomography mission) CO datasets MOPITT and ATom.

MOPITT is the only currently operating satellite instrument deriving CO from near-infrared (NIR), thermal-infrared (TIR), and multispectral (TIR+NIR) radiances; also, it has the longest global CO record to date (2000-present). Because TROPOMI is TROPOMI was, until recently, the only other operative satellite instrument retrieving CO from NIR measurements. (ENVISAT SCIAMACHY (2002-2012;

?) and GOSAT-2 TANSO-FTS-2 (since 2019;

?) are two other instances.) Thus, understanding how MOPITT and TROPOMI retrievals compare to each other is keyimportant. MOPITT results are systematically validated using airborne vertical profiles (?, and references therein) and ground measurements (??), as well as compared to other satellite datasets (???). Thus, its continuity and consistency are well understood.

Despite the low reflectivity of open water, TROPOMI CO retrievals over bodies of water are possible if clouds are present. In these cases partial CO columns under the cloud tops are approximated by scaled TROPOMI reference profiles (?). We quantify the error introduced by this approach by comparing TROPOMI CO retrievals over bodies of water to both airborne ATom-4 (fourth ATom campaign) and MOPITT TIR data.

Next we describe the datasets used (Sect. ??), detail how comparisons were performed (Sect. ??), present results from these comparisons (Sect. ??), discuss their significance (Sect. ??), and offer conclusions (Sect. ??). Additional results are available in the Supplement Materials.

#### 65 **2 Data**

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## 2.1 TROPOMI

TROPOMI is a push-broom imaging spectrometer on board ESA's Sentinel-5 Precursor platform, flying in a sun-synchronous orbit at 824 km altitude and 13:30 LST (local standard time) Equator crossing time. Its swath width of 2600 km allows for global daily coverage at very high spatial resolution, with a 7.2 x 7.2 km² footprint at nadir (?). (A change in the Copernicus Sentinel-5P operations scenario postdating the work presented here has resulted in a 7.2 x 5.6 km² footprint at nadir, starting 6 August 2019.) TROPOMI measures radiances in the ultraviolet, visible, and solar reflected infrared. Total CO column values are obtained from measurements of reflected solar infrared radiation in the 2.3  $\mu$ m spectral range (?), corresponding to the first overtone of the CO stretch fundamental. Over land, retrievals are performed in both clear and cloudy conditions. Because of the TROPOMI CO retrievals over bodies of water are possible if clouds are present in the field of view (?); otherwise, because of the low reflectivity of open water, retrievals over bodies of water are performed only in cloudy conditions to shortwave infrared solar radiation, insufficient radiance would be available for the instrument to measure. TROPOMI retrievals are achieved by estimating the altitude of the cloud top from the difference between measured and modeled methane, as described in ?, and then approximating the partial CO column under the cloud top by the colocated, scaled TROPOMI reference profile partial column.

TROPOMI CO retrievals are based on SICOR (Shortwave Infrared Carbon Monoxide Retrieval) (?). In this physics-based algorithm, the retrieval state vector includes a single scaling factor representing the ratio of the retrieved CO profile to the reference CO profile (?). Reference profiles are generated with the global chemical transport model TM5 (?); they are variable with respect to location, month, and year. Retrieved total CO column values simply correspond to the vertically-integrated CO profile. Over land, in the absence of clouds, the TROPOMI total CO column averaging kernel (AK; Fig. ??) is near unity over the entire vertical profile (?). Thus, clear-sky total CO column retrievals are negligibly affected by either the actual vertical distribution of CO or the shape of the CO reference profile. In the presence of clouds, however, over both land and bodies of water, the total CO column retrievals are mainly sensitive to the above-cloud CO partial column. The lack of sensitivity to the

below-cloud CO partial column is compensated by increasing the sensitivity to the above-cloud CO partial column. Clouds thus lead to total column AK values greater than one above the cloud decreasing towards zero below the cloud (?).

The earliest TROPOMI CO retrievals date from 7 November 2017; therefore, this is the initial date of the period we analyze here. For any given day, we used either OFFL (offline) or RPRO (reprocessed) files, all from Collection 01, and from the most recent processor version available (10001, 10002, 10100, 10200, 10202, 10301, or 10302).

Retrievals were filtered as follows. The two most westward pixels in each granule were removed to avoid artifacts from unresolved calibration issues (??); daytime only observations were selected by keeping those with solar zenith angle  $<80^{\circ}$ . Quality flag values (QA) were used to preserve clear-sky and clear-sky-like observations over land (QA = 1, corresponding to optical thickness <0.5 and cloud height <500 m) or observations with mid-level clouds over bodies of water (QA = 0.5; optical thickness >0.5 and cloud height <5000 m) (?).

## 2.2 MOPITT

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MOPITT is a cross-track scanning gas correlation radiometer on board NASA's Terra satellite (???). Terra is in a sunsynchronous orbit at 705 km altitude and 10:30 LST Equator crossing time. MOPITT has horizontal resolution near 22 x 22 km<sup>2</sup> at nadir and a swath width of 640 km; global coverage is achieved in approximately 3 days. MOPITT observations enable retrievals of tropospheric CO vertical profiles and corresponding total column amounts from both TIR and NIR measurements in the spectral regions where the fundamental ( $\sim$ 4.7  $\mu$ m) and first overtone ( $\sim$ 2.3  $\mu$ m) of the CO stretch occur, respectively. TIR measurements are useful over both bodies of water and land, day and night; NIR radiances only in daytime observations over land. MOPITT CO retrieval products are available in three variants (TIR-only; NIR-only; and TIR+NIR, or multispectral) characterized by different vertical sensitivity and random retrieval noise (?, and references therein).

Unlike TROPOMI's, the MOPITT retrieval algorithm relies on optimal estimation whereby *a priori* information constrains the retrieved profile in the absence of information from the measured radiances (?). MOPITT *a priori* profiles vary seasonally and geographically according to a multi-year (2000-2009) Community Atmosphere Model with Chemistry (CAM-Chem) model-based CO climatology (?). MOPITT profile retrievals are performed on a ten-level pressure grid; the reported retrieval for each level indicates the mean volume mixing ratio (VMR) in the layer immediately above that level. Reported total CO column values are obtained by integrating the retrieved VMR profiles from the surface to the top of the atmosphere. Internally, CO concentrations in the retrieval state vector are represented in terms of the logarithm of the VMR. For each retrieved CO profile, both the full retrieval AK matrix and total column AK are produced simultaneously and are provided as diagnostics. As indicated by the AK (Fig. ??), sensitivity characteristics of the three products are quite different (?). With respect to vertical sensitivity, the total column AK for the NIR-only product are most similar in shape to the TROPOMI total column AK, but NIR retrievals can be significantly constrained by the *a priori*. In comparison, TIR-only total column AK exhibit weaker sensitivity to CO near the surface, but TIR retrievals are less strongly weighted by the *a priori* overall. TIR+NIR total column AK are typically more uniform than for TIR-only retrievals, although the benefits of combining TIR and NIR measurements are only apparent in daytime observations over land.

Here we use daytime archive MOPITT data from version 8 (?); among other improvements, V8 products do not exhibit a latitudinal dependence in partial CO column biases observed in V7. The MOPITT retrieval algorithm processes only clear-sky observations (?). The clear/cloudy status of an observation is typically determined from MOPITT radiances as well as a cloud mask (?) based on simultaneous observations by MODIS (MODerate resolution Imaging Spectroradiometer, also on board the Terra platform). MODIS observations (~480; note The ~480 MODIS observations at 1 km resolution) x 1 km² horizontal resolution acquired at the same time as a single MOPITT observation and within the MOPITT footprint are identified and collected; relevant MODIS cloud descriptors (available in the MOPITT L2 product) are evaluated. MOPITT observations for which at least 95% of the colocated MODIS cloud mask values are considered clear are passed to the retrieval algorithm. MOPITT archive data are those corrected with gain and offset values derived from an interpolation performed between two consecutive hot-calibration events, which are usually executed once per year. This retrospective correction alleviates large differences in total column values otherwise observed in NIR retrievals; TIR products are affected to a much lesser degree (?). Here we use MOPITT archive data produced after the hot calibration performed between 11 and 23 March 2019; thus, the closing date for the period analyzed here is 10 March 2019. Total column validation results for version 8 products indicate that relative biases and standard deviations are less than 1 and 7 %, respectively (i.e., less than 0.5 and 1.5 x 10<sup>17</sup> molec. cm²) (?).

## 135 2.3 ATom-4

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To analyze TROPOMI retrievals over bodies of water we use ATom (?) in situ CO profiles from its fourth campaign, carried out between 24 April and 21 May 2018. During ATom-4 more than 150 vertical profiles were acquired, most of them over water in the Atlantic and Pacific regions, and covering a wide latitudinal range. CO concentrations along those profiles were measured with the Harvard QCLS (pulsed-Quantum Cascade Laser System) instrument (??) and the NOAA Picarro Cavity Ring Down Spectrometer (??), both on board NASA's DC-8 platform. Measurements were acquired from 0.2 to 12 km altitude at 1 Hz sampling rate. The QCLS instrument operates in the 4.59  $\mu$ m region, with precision and accuracy of 0.15 and 3.5 ppb, respectively (?). The NOAA Picarro measures radiation in the 1.57  $\mu$ m region, where the second overtone of the CO stretch is located; the estimated total uncertainty of its measurements is 5.0 ppb at 1 Hz, or 3.4 ppb at 0.1 Hz (?). Here we use the merged QCLS-Picarro data product CO.X from the dataset version published 28 March 2018 and updated 25 November 2019. The quantity CO.X uses QCLS CO data with calibration gaps filled in by Picarro CO data, after subtracting the low-pass filtered difference between the QCLS and the somewhat noisier Picarro measurement. Both instruments were calibrated to the NOAA X2014A CO scale. Measurements account for drift of CO in their field calibration tanks (?) by having them measured at the central calibration laboratory before and after the campaign and applying a linear drift correction to the assigned values.

## 3 Methods

## 3.1 Land retrieval comparisons

To validate TROPOMI land CO retrievals, we selected six ROIs (regions of interest; Fig. ??) representative of either polluted or elean regimes. Polluted ROIs include: south-eastern USA (thereafter referred to as USA; 35°N, 95°W to 40°N, 75°W), central Europe (Europe; 45°N, 0°E to 55°N, 15°E), northern half of the Indian Subcontinent (India; 20°N, 70°E to 30°N, 95°E), and north-eastern China (China; 30°N, 110°E to 40°N, 123°E). Clean ROIs are: northern Africa and Arabia (Sahara; 15°N, 20°W to 30°N, 50°E) and western Australia (Australia; 32°S, 112°E to 17°S, 138°E). Two additional ROIs were defined to represent most of the northern and southern (N and S)hemispheres (0°N to 60°N and 60°S to 0°N, respectively).

TROPOMI and MOPITT retrievals covering each of these ROIs for-

In Sect. ?? we separately present quantitative comparisons of TROPOMI total column retrievals with MOPITT total column retrievals and with *in situ* profiles measured from aircraft. However, different methods are required in each case (?). Comparisons with *in situ* profile data are generally simpler and more easily interpreted, because the vertical sensitivity of the satellite measurement can be represented exactly using the retrieval AK.

# 3.1 MOPITT and TROPOMI algorithm differences

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Fundamental differences in the MOPITT and TROPOMI retrieval algorithms result in a challenge to find consistent intercomparison methods. The MOPITT algorithm is based on optimal estimation as developed by ?. TROPOMI uses a profile-scaling algorithm based on Tikhonov regularization, as described in ?, ?, ?, and references therein. Moreover, the period between 7 November 2017 MOPITT state vector and AK are based on CO profiles of log(VMR) whereas the TROPOMI retrieval algorithm involves CO profiles expressed in column density values (molecules per unit area). For simplicity, we assume in the following discussion that MOPITT log(VMR)-based quantities can be converted to column density-based quantities.

Thus, neglecting error terms, we can write for MOPITT

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$$c^{MOP} \approx a^{MOP} x_{true} + (C - a^{MOP}) x_a^{MOP}$$
 (1)

where  $c^{MOP}$  is the retrieved total column,  $a^{MOP}$  is the column density-based total column AK,  $x_{true}$  is the true profile, C is the total column operator, and 10 March 2019 were gathered and filtered to keep only clear daytime data over land. According to , comparisons of remote sounder retrievals obtained with optimal estimation based methods must take into account the differences of the observation systems (e.g., AK and  $x_a^{MOP}$  is the a priori). However, as discussed earlier, TROPOMI uses a method which scales the reference profiles such that the retrieved total columns are independent of them . Therefore, because the methodology is not applicable in this case, MOPITT and TROPOMI total column retrievals are compared here without any transformation, profile,  $c^{MOP}$ ,  $x_{true}$ , and  $x_a^{MOP}$  are all expressed in column density (molecules per unit area). C and  $a^{MOP}$  are dimensionless.

Colocated and non-colocated retrievals from the two instruments were analyzed separately; results from the former are presented in the following sections, supporting results from the latter in the Supplement Materials. We apply the term 'colocated' to pairs of retrievals from two different datasets acquired on the same day and within ≤ 50 km in horizontal distance. In contrast, we apply the term 'non-colocated' to retrievals from two different datasets acquired on the same day and inside the same ROI.

Colocated samples allow for a more direct comparison, since they are more closely representative of the same atmospheric conditions. By using non-colocated retrievals we maximized the size and diversity of the populations analyzed.

Daily scatterplots for each ROI were obtained from the colocated retrievals. We quantified, among others, daily bias (i.e., accuracy) and standard deviation (i. e., precision) between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR). Relative bias values (in %) were calculated with respect to MOPITT in all cases (100x(TROPOMI-MOPITT). Column bias values (in molec. cm<sup>-2</sup>), also provided for completeness, were calculated with respect to MOPITT (TROPOMI-MOPITT). Thus, a negative bias would indicate that TROPOMI CO values are lower than their MOPITT counterparts.

## 3.2 Water retrieval comparisons

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TROPOMI CO retrievals over bodies of water are possible if clouds are present in the field of view; otherwise, because of the low reflectivity of open water to shortwave infrared solar radiation, insufficient radiance would be available for the instrument to measure. TROPOMI retrievals are achieved by estimating the altitude of the cloud top from the difference between measured and modeled methane, as described in, and then approximating the partial CO column under the cloud top by the colocated, scaled TROPOMI reference profile partial column. For validating TROPOMI total column retrievals over bodies of water, we performed separate comparisons with For TROPOMI, however, we have

$$c^{TROP} \approx a^{TROP} x_{true}$$
 (2)

where  $in\text{-}situc^{TROP}$  profiles from the ATom-4 campaign and with MOPITTIR-only retrievals. Given their nature, all comparisons over bodies of water used colocated observations is the retrieved total column and  $a^{TROP}$  is the total column AK. Thus, the retrieved total column for MOPITT partially depends on a "null-space contribution" given by the term  $(C - a^{MOP}) x_a^{MOP}$  whereas the TROPOMI total column retrieval lacks this term. For MOPITT, this term represents the weighting of the MOPITT a priori profile in the retrieved total column. As noted in ?, a null-space contribution term is not beneficial for data assimilation applications, but may be added to the TROPOMI total column retrieval by the user if a particular source of a priori information is desired. This option is applied in Sect. ?? and ?? as a means of testing the influence of the a priori profile on MOPITT/TROPOMI comparisons.

# 3.1.1 TROPOMI versus ATom-4: AK analysis

## 3.2 In-situ validation: TROPOMI versus ATom-4

In-situ profile data acquired from aircraft are well-suited for validating satellite CO retrievals. To validate TROPOMI retrievals over bodies of water, we In the following we use the ATom-4 in-situ dataset, which mainly includes over-ocean observations. We derived both true and retrieval-simulated (i.e., unsmoothed and smoothed) total CO column values from the ATom-4 profiles; smoothed values account for the vertical sensitivity of the TROPOMI measurements as expressed by their AK.

Prior to obtaining unsmoothed/smoothed ATom-4 total CO columns, complete (e.g., from the surface to the top of the atmosphere) ATom-4 CO profiles were generated following the standard method for MOPITT validation with airborne data.

Profiles that did not cover the 400-to-800 hPa range were rejected. The remaining profiles (between 271 ± 48 hPa and 983 ± 32 hPa) were interpolated to match the MOPITT *a priori* 35-level vertical grid, which preserves high vertical resolution in the troposphere. Empty levels at the bottom of each interpolated profile (levels with no CO value) were filled with the interpolated measurement closest to the surface. Similarly, empty levels between the top of the interpolated profile and the tropopause were filled with the interpolated measurement closest to the tropopause. Finally, empty levels above the tropopause were filled with colocated MOPITT *a priori* CO values. Unsmoothed ATom-4 total CO column values were then calculated as follows:

where  $Cx_{true}$  is the total column value expressed as an array of partial column values in molec. cm<sup>-2</sup>, the constant  $n2.12 \times 10^{13}$  is the number of partial columns in the profile molec. cm<sup>-2</sup>  $hPa^{-1}$  ppby<sup>-1</sup>,  $\Delta p_{\overline{\imath}}$  is the thickness-array of partial column ipressure thicknesses in hPa, and  $x_{\overline{\imath}}VMR$  is the mean VMR for the layer above level ireported array of VMR values in ppbv units. The derivation of Eq. (??) ?? can be found in ?.

Smoothed ATom-4 total CO column values involve the TROPOMI AK, which are provided with the actual total column retrievals. In cloudy scenes, are more sensitive to CO above the cloud than to CO below the cloud; smoothed total column values account for this effect explicitly. As shown in borsdorff14and, the relation between the retrieved TROPOMI total column  $\hat{c}$ and the true CO profile  $\rho^{true}$  (a vector of CO partial column values rather than VMR values) can be expressed as

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$$\hat{c} = A^{col} \rho^{true} + \epsilon_x$$

where  $A^{col}$  is the TROPOMI column AK and  $\epsilon_x$  is the retrieval error. Thus Similarly to Eq. ??, smoothed ATom-4 CO profiles can be calculated using

$$c^{sim} = A^{col} \rho^{true}$$

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and substituting  $p^{true}x_{true}$  by the complete ATom-4 profiles obtained as detailed above and interpolated to match the 50-level vertical grid of their colocated TROPOMI total column AK. Finally, smoothed ATom-4 total CO column values are calculated applying Eq. (???). ??).

Comparisons between TROPOMI total column retrievals and true (unsmoothed) ATom-4 total column values are the most direct, but they are subject to various sources of random and systematic error. Comparisons between TROPOMI total column retrievals and retrieval-simulated (smoothed) ATom-4 column values should be less affected by TROPOMI vertical sensitivity variations, and can be used to investigate the overall performance of the retrieval. Relative bias values were calculated with respect to ATom in all cases (100x(TROPOMI-ATom)/ATom); column bias values too (TROPOMI-ATom).

In addition, we quantified the error introduced by approximating the partial column below cloud top with the TROPOMI reference profile by calculating the null-space error of the TROPOMI retrieval process ( $e_{null}$ ) as described in ? and ?:

$$e_{null} = (\underline{IC} - \underline{A^{col}}\underline{a^{TROP}}) \rho^{true} x_{true}$$
(4)

245 where I is the altitude integral operator. As discussed in Sect. ??, analysis of  $e_{null}$  may be useful for diagnosing retrieval errors over cloudy scenes related to the shape of the TROPOMI model-calculated reference profiles.

## 3.3 Satellite comparisons: TROPOMI versus MOPITT

## 3.3.1 Sources of error

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Satellite-based retrievals of CO total column, like other remote sensing retrievals, are subject to several sources of error (?).

Prominent sources of error for both MOPITT and TROPOMI include smoothing error (related to the departure of the total column AK from the ideal dependence, which would have a value of 1 at all altitudes) and random retrieval noise. Other potentially important effects which are not considered further include model parameter error and forward model error (?). Retrieval averaging can be used to reduce the effects of retrieval noise but does not reduce smoothing error. Smoothing error is instrument-dependent; it also depends on details of the retrieval algorithm. For both MOPITT and TROPOMI, the total column smoothing error is related to the total column AK and true CO profile, similarly to what Eq. ?? shows.

## 3.3.2 TROPOMI versus MOPITT TIR: above/below cloud analysis

For this comparison we assumed that TROPOMI retrievals are only sensitive to CO above cloud top, while CO below cloud top is fully approximated by TROPOMI's scaled reference profiles. This scenario would be most accurate in case of optically thick clouds. To quantify the error introduced by approximating below-cloud-top CO with TROPOMI reference profiles, we compared TROPOMI retrievals over bodies of water (total columns and their above cloud partial column components) to their colocated MOPITT TIR counterparts. For each TROPOMI observation, As discussed in Sect. ??, smoothing error for TROPOMI retrievals in clear-sky scenes over land is generally very small since apartial above cloud column was calculated by subtracting from the reported total TROPOMI column the below cloud partial column of its colocated, scaled TROPOMI reference profile, available in TROP is near 1 at all altitudes. In scenes containing clouds, which includes all TROPOMI retrievals over the ocean, a25-level vertical grid. Scaling factors produced in the TROPOMI retrieval process are not included in TROPOMI retrievals greater than 1 above the cloud and decreases to less than 1 below the cloud (Fig. ??). However, as a result of the profile-scaling method used by TROPOMI, smoothing error also vanishes if the shape of the true profile converges with the shape of the assumed reference profile, even in cloudy scenes (?). Smoothing error for TROPOMI will thus be largest in cloudy scenes where the reference profile and true profile exhibit a significant difference in shape.

Smoothing error associated with the MOPITT total column AK, discussed in Sect. ??, varies for the TIR-only, NIR-only and TIR+NIR products. However, as indicated by Fig. ??, total column smoothing error for all MOPITT variants will typically be larger than for TROPOMI, because of significant differences of  $a^{MOP}$  from the ideal column AK.

Methods for comparing remote sensing retrievals of geophysical quantities (such as trace-gas vertical profiles) from different instruments are described in ?. Effects that contribute to differences in retrieved values include the use of different *a priori* information for each instrument, differences in AK, and differences in instrument noise. One goal of the described methods is to determine whether or not observed differences in retrievals for two instruments are statistically consistent with known

differences in *a priori*, AK, and instrument noise. However, this goal is elusive because technically it also requires knowledge of the statistics (mean and variability) of the ensemble of true atmospheric states being used for the comparisons; this information is often unknown.

Our main goal in performing comparisons of MOPITT and TROPOMI total column retrievals is to quantify differences between the two retrieval products available to users, rather than quantify the actual bias of either product. This goal is addressed by direct "end to end" comparisons of the two untransformed products in various geographical regions, after appropriate matching of the MOPITT and TROPOMI retrievals in space and time. These comparisons quantify the MOPITT/TROPOMI difference statistics (e.g., bias and standard deviation) due to all effects: AK differences, *a priori* differences, and instrument noise.

A secondary goal of the comparisons is to specifically investigate the influence of *a priori* information on MOPITT/TROPOMI retrieval differences. Unlike the AK, which depend fundamentally on characteristics of the instrument, the source of *a priori* (or reference profiles, in the TROPOMI product; we obtained those by dividing each reported TROPOMI total CO column retrieval by the case of TROPOMI) is a choice of the retrieval algorithm developers. The method for addressing this goal described in ? assumes that both retrievals exhibit a similar *a priori* dependence, represented by Eq. ??, and is thus not applicable to TROPOMI. An alternative strategy, suggested in ?, is to add a null-space contribution  $c_{null}^{TROP}$  to the TROPOMI total CO column of its colocated reference profile, calculated using Eq. (??). Total and partial above cloud column values were also calculated for the colocated MOPITT TIR profiles interpolated to match the 25-level vertical grid of the reference profiles. The same analysis was performed using retrievals based on the MOPITT *a priori* profile, i.e.,

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$$c_{adj}^{TROP} = c^{TROP} + c_{null}^{TROP} = a^{TROP} x_{true} + (C - a^{TROP}) x_a^{MOP}$$

$$(5)$$

where  $c_{adj}^{TROP}$  is the null-space adjusted TROPOMI total column. The adjustment term  $c_{null}^{TROP}$  effectively uses the MOPITT  $a\ priori$  profile to estimate the CO partial column for profile levels where the TROPOMI measurement lacks sensitivity. This term vanishes when  $a^{TROP}$  approaches C and when  $x_a^{MOP}$  approaches the TROPOMI reference profile  $x_{ref}^{TROP}$  (because  $a^{TROP}\ x_{ref}^{TROP}\ = C\ x_{ref}^{TROP}$ ). For MOPITT/TROPOMI comparisons, this adjustment to the TROPOMI retrieved total columns should reduce differences due to discrepancies between the MOPITT  $a\ priori$  profile and TROPOMI reference profile, but should have no effect on differences related to discrepancies in retrieval AK or other sources of retrieval bias. Results of MOPITT/TROPOMI comparisons incorporating this adjustment over land and oceanic regions are presented in Sect. ?? and ???, respectively.

## 3.3.2 Land retrieval comparisons

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Over land, MOPITT and TROPOMI total column retrievals were compared in clear-sky scenes only. In such scenes, TROPOMI smoothing error is typically negligible since  $a^{TROP}$  is close to 1 at all altitudes. For these comparisons, we selected six ROIs (regions of interest; Fig. ??) representative of either polluted or clean regimes. Polluted ROIs include: south-eastern USA (thereafter referred to as USA; 35°N, 95°W to 40°N, 75°W), central Europe (Europe; 45°N, 0°E to 55°N, 15°E), northern half of the Indian Subcontinent (India; 20°N, 70°E to 30°N, 95°E), and north-eastern China (China; 30°N, 110°E to 40°N,

123°E). Clean ROIs are: northern Africa and Arabia (Sahara; 15°N, 20°W to 30°N, 50°E) and western Australia (Australia; 32°S, 112°E to 17°S, 138°E). Two additional ROIs were defined to represent most of the northern and southern (N and S) hemispheres (0°N to 60°N and 60°S to 0°N, respectively). TROPOMI and MOPITT retrievals covering each of these ROIs for the period between 7 November 2017 and 10 March 2019 were gathered and filtered to keep only clear daytime data over land.

Colocated and non-colocated retrievals from the two instruments were analyzed separately; results from the former are presented in Sect. ??, whereas supporting results from the latter are presented in the Supplement Materials. We apply the term 'colocatedTROPOMI and ATom-4 data; results are available in the Supplement Materials.' to pairs of retrievals from two different datasets acquired on the same day and within  $\leq 50$  km in horizontal distance. In contrast, we apply the term 'non-colocated' to retrievals from two different datasets acquired on the same day and inside the same ROI. Colocated samples allow for a more direct comparison, since they are more closely representative of the same atmospheric conditions. By using non-colocated retrievals we maximized the size and diversity of the populations analyzed.

Daily scatterplots for each ROI were obtained from the colocated retrievals. We quantified, among others, daily bias (i.e., accuracy) and standard deviation (i.e., precision; calculated from individual biases between each pair of colocated observations) between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR). Relative bias values (in %) were calculated with respect to MOPITT in all cases (100×(TROPOMI-MOPITT)/MOPITT). Column bias values (in molec. cm<sup>-2</sup>), also provided for completeness, were calculated with respect to MOPITT (TROPOMI-MOPITT). Thus, a negative bias would indicate that TROPOMI CO values are lower than their MOPITT counterparts.

Results from an analogous comparison of colocated MOPITT and null-space adjusted (as described in Sect. ??) TROPOMI total column retrievals can also be found in Sect. ??.

## 330 3.3.3 Water retrieval comparisons

Two types of MOPITT/TROPOMI comparisons were made over oceanic regions. Direct comparisons, performed without any adjustments to either the MOPITT or TROPOMI total column values, are presented in Sect. ??. Comparisons incorporating the TROPOMI null-space adjustment, as described in Sect. ??, are presented in Section ??. Statistics for the Northern and Southern Hemispheres are analyzed separately. Given their nature, all comparisons over bodies of water used colocated observations.

## 335 4 Results

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Land-only comparisons have the purpose of evaluating TROPOMI's performance with respect to MOPITT TIR, NIR, and TIR+NIR. Separate comparisons were performed using either colocated data (results in Sect. ??; for untransformed and null-space adjusted TROPOMI) or non-colocated data (Supplement Materials). Water-only comparisons aim to estimate the error introduced in TROPOMI retrievals over bodies of water, only possible in cloudy conditions, by approximating CO concentrations below cloud top by colocated, scaled TROPOMI reference profile values. Two sets of water-only comparisons were performed. First, with respect to *in situ* ATom-4 profiles, accounting for differences in TROPOMI vertical sensitivity

as represented by its AK (Sect. ??). Second, we compared untransformed TROPOMI with respect to MOPITT TIR (???)total column values (Sect. ??). Third, we compared null-space adjusted TROPOMI with respect to MOPITT TIR total column values (Sect. ??). Additional comparisons with respect to MOPITT TIR and ATom-4 profiles (Supplement Materials) assuming a simple scenario where TROPOMI only had sensitivity to CO above cloud top are available in the Supplement Materials; this approximation would be most accurate for optically thick clouds.

## 4.1 TROPOMI retrievals over land

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Here we describe results from the comparison of daily (from 7 November 2017 to 10 March 2019) colocated TROPOMI and MOPITT retrievals over 8 ROIs: 2 hemispheric, 4 representative of polluted regions, and 2 of clean regions (Fig. ??). Daily bias and standard deviation values calculated between TROPOMI and each of the three MOPITT products are presented below.

## 4.1.1 TROPOMI versus MOPITT TIR

Daily results from the analysis of colocated TROPOMI and MOPITT TIR data (Fig. ??) show that during the ~1.5 years analyzed, TROPOMI and MOPITT TIR total CO column retrievals were close to each other both in magnitude and temporal variation. Both datasets agree in displaying strong differences between clean ROIs (Sahara and Australia; 10-20 x 10<sup>17</sup> molec. cm<sup>-2</sup>) and highly polluted ROIs (India and China; 15-40 x 10<sup>17</sup> molec. cm<sup>-2</sup>). They also show the expected differences between the two hemispheres: retrievals are, overall, lower in the S Hemisphere ROI (10-20 x 10<sup>17</sup> molec. cm<sup>-2</sup> versus 15-22 x 10<sup>17</sup> molec. cm<sup>-2</sup>) due to less land area, population, and industrial activity. Both TROPOMI and MOPITT TIR show similar seasonal variability. ROIs located in the northern hemisphere present an absolute maximum during boreal winter and a secondary maximum in late boreal summer. The absolute maximum is consistent with winter CO accumulation due to shorter days and (at high latitudes) larger solar zenithal angles resulting in less photolysis, and to increased emissions due to biomass burning north of the Equator in Africa. The secondary maximum is most likely due to fire emissions. Conversely, seasonal trends in southern hemisphere ROIs show a maximum in September-October, consistent with CO accumulation during austral winter and emissions from biomass burning S of the equator.

Daily relative bias values are generally within a  $\pm 10$  % range for all the ROIs except the two most polluted, India and China (Fig ??.e and ??.f), where biases reach higher values, mostly in the -20 to 20 % range. When averaged over time (Table ????), relative biases are between -8.15 % (Sahara) and 3.55 % (China), with a mean for all the ROIs of -3.73 %. We note that biases for most ROIs are predominantly negative, except for China, where most daily biases are positive. Averaged relative standard deviation values per ROI are between 6.05 and 16.04 % (USA and S Hemisphere, respectively), with a mean for all ROIs of 11.51 %.

## 370 4.1.2 TROPOMI versus MOPITT NIR

Figure ?? shows daily results from the comparison of colocated TROPOMI and MOPITT NIR land retrievals; time-averaged results are summarized in Table ????. The ranges of daily mean retrievals and seasonal trends observed in each ROI are in

general analogous to those described in Sect. ??. Relative bias values averaged for the period analyzed range between -7.93 % (USA) and 2.86 % (Sahara), while the mean for all the ROIs is -2.24 %. Daily relative bias values for the Sahara ROI (-5 to 12 % range; Fig. ??.g) differ strongly from those calculated with respect to MOPITT TIR (Fig. ??.g) (-12 to -5 % range). For all the other ROIs, relative biases with respect to MOPITT NIR are broadly similar in magnitude to those with respect to MOPITT TIR, albeit the former present larger oscillations with time. This is consistent with the MOPITT NIR retrievals being more sensitive to geophysical noise due to changes in albedo during a MOPITT observation associated with spacecraft motion (?). Relative standard deviation values averaged over time are between 9.95 and 16.15 % (USA and China, respectively), with a mean for all ROIs of 12.38 %.

## 4.1.3 TROPOMI versus MOPITT TIR+NIR

Daily results from colocated TROPOMI and MOPITT TIR+NIR retrievals are shown in Fig. ??; time-averaged results are summarized in Table ????. Results are similar to those described in Sect. ?? in terms of daily mean retrieval values, retrieval seasonal trends, and relative biases. The latter range between -7.94 % (Sahara) and 4.53 % (China); the mean for all ROIs is -3.22 %. Averaged relative standard deviation values are between 6.48 % (Sahara) and 15.68 % (S Hemisphere), with a mean for all ROIs of 11.13 %.

## **4.1.4** Null-space adjusted TROPOMI versus MOPITT

Table ?? summarizes time-averaged bias values resulting from the comparison of colocated, null-space adjusted TROPOMI and MOPITT land retrievals. Relative bias values averaged for all ROIs are -2.52, -1.07, and -1.99 % (for MOPITT TIR, NIR, and TIR+NIR, respectively). Similarly, averaged relative standard deviation values are 11.57, 12.40, and 11.21 %. Daily results are analogous to those shown in Fig. ??, ??, and ?? both in magnitude and temporal variation.

## 4.2 TROPOMI retrievals over water

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Next we present results from the comparison of colocated TROPOMI and ATom-4 retrievals between 24 April and 21 May 2018 over the Atlantic and Pacific regions. Similarly, we describe results obtained from colocated TROPOMI and both untransformed and null-space adjusted) and MOPITT TIR over-water retrievals acquired between 7 November 2017 and 10 March 2019 over the two hemispheric ROIs. The ATom-4 data offer the opportunity to compare TROPOMI retrievals to *in situ* measurements; the MOPITT dataset has the advantage of a substantially larger number of samples, distributed over a longer period of time and a wider geographical area.

## 4.2.1 TROPOMI versus ATom-4: AK analysis

Results from the TROPOMI and ATom-4 comparison over bodies of water are summarized in Fig. ?? and Table ????. As described in Sect. ??, comparisons were performed both in terms of true (unsmoothed) and retrieval-simulated (smoothed) ATom-4 total column values; the latter account for the vertical sensitivity of the TROPOMI retrievals. Figure ??.a shows that

unsmoothed ATom-4 total CO columns and TROPOMI are strongly correlated (R = 0.93, slope of linear fit = 0.96) and exhibit a negative relative bias (-4.76 %) indicative of low TROPOMI values with respect to the true ATom-4. In contrast, Fig. ??.b shows results for smoothed ATom-4 versus TROPOMI. The relative bias is in this case better (3.25 %) and the fit between the two datasets has a slightly larger R (0.94), indicative of an improved correlation. The slope of the linear fit is, however, slightly lower (0.90). Figure ?? shows the smoothed ATom-4 values in the context of TROPOMI; TROPOMI clearly captures the geographical patterns of the *in situ* measurements. Relative biases show no latitudinal dependence (Fig. ??).

As seen in Sect. ??, we can separately quantify the expected difference between the true total column and the TROPOMI retrieved total column due to the differences in shape between the true profile and the TROPOMI reference profile. In clear-sky scenes (over land), the TROPOMI radiances fundamentally measure the integrated total column and the shape of the reference profile does not significantly affect the accuracy of the retrieved total column. In cloudy scenes (over land or water), however, the total column retrieval becomes more sensitive to above-cloud CO than to below-cloud CO; the validity of the reference profile shape acts in this case as a source of retrieval error. Values of the null-space error (e<sub>null</sub>) calculated for each ATom-4 profile using Eq. (??) ?? versus latitude are shown in Fig. ??. The relative mean and standard deviation values of e<sub>null</sub> calculated with respect to true (unsmoothed) ATom-4 total columns are 2.16 ± 2.23 % (i.e., 3.70 ± 3.75 x 10<sup>16</sup> molec. cm<sup>-2</sup>). The prevalence of positive values for e<sub>null</sub> indicates that, on average, the reference profiles analyzed have a slight tendency to have too much CO near the surface, resulting in an overestimate of the below-cloud partial column. No clear latitudinal dependence is observed in e<sub>null</sub>.

#### 420 4.2.2 TROPOMI versus MOPITT TIR: above/below cloud analysis

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Figure ?? and Table ?? Figure ?? a and Table ?? summarize results from our comparison of colocated TROPOMI and MOPITT TIR retrievals over bodies of water in the N Hemisphere ROI. The top panels in Fig. ?? illustrate a comparison between total column (above and below cloud top) and partial column (above cloud top) retrievals for a single day, 1 January 2018. Partial column values from TROPOMI and MOPITT are more strongly correlated in this particular date, as shown by a larger R (0.87 versus 0.73) and a smaller relative bias (2.77 versus 2.92 %). The bottom panels in Fig. ?? summarize similar daily results for the entire ~1.5-year period analyzed. Relative biases between TROPOMI and MOPITT TIR for total or partial columns Relative biases are small (in the ~2 to 11 % range, ~4 % 3.82 % on average)and follow the same temporal patterns; their differences (total column bias ~ partial column bias) range from ~1.79 to 1.56 p.p. (percentage point), with a ~0.53 p.p. mean. Standard deviation values are on averagearound 13-15 %.

Similar results: the standard deviation of the biases is 13.27 % on average. Results for the S Hemisphere ROI are summarized in Fig. ?? and Table ??. Partial column values for 1 January 2018 (Fig. ??.b) have a larger R (0.84 versus 0.79) and appear more strongly correlated than their total column counterparts (Fig. ??.a). They, however, show a larger relative bias (2.16 versus 0.36 %). Similar results for the entire period analyzed (Fig. ??.c and .d) indicate that relative biases for either total or partial columns ??.b and Table ??. Relative biases and their standard deviation values are similarly small, ranging from -5 to 7 (~3 % mean). Their differences are in the -3.62 to 0.97 p. p. range, with a -1.02 p.p. mean. Standard deviations are in the 18-21 % range(2.14).

% and 18.15 % on average). As expected, retrievals are higher in the N Hemisphere, due to larger emissions from the continents in that hemisphere. Seasonal patterns in daily CO means are analogous to those described for the two hemispheric land ROIs.

Based on the difference in relative bias between the total (above and below cloud)

## **4.2.3** Null-space adjusted TROPOMI versus MOPITT TIR

Table ?? summarizes time-averaged bias values resulting from the comparison of colocated, null-space adjusted TROPOMI and MOPITT TIR retrievals over bodies of water. Relative bias values averaged for the period analyzed are 5.90 and partial (above cloud) column analyses, we estimate that approximating TROPOMI CO below cloud top by scaled reference profiles results, on average, in a ~0.78 p.p. error. As explained in Sect. ??, this approach would be most accurate in the presence of optically thick clouds which would preclude TROPOMI sensitivity below cloud top3.82 % (N and S Hemisphere ROIs, respectively); averaged relative standard deviation values are 13.19 and 18.11 %. Daily results are analogous in magnitude and temporal variation to those shown in Fig. ??.

## 5 Discussion

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TROPOMI and MOPITT are consistent with each other in terms of the main spatial and seasonal CO features they capture, as shown by mean seasonal maps (Fig. ??). Both datasets display relatively high values in the Northern hemisphere during boreal winter (panels .a and .b) and spring (.c and .d), similarly high values during all seasons in Africa and Asia, and relatively high values due to Amazon fires in austral summer and fall (.a and .b, .g and .h). We note differences between TROPOMI and MOPITT that we interpret as due to their contrasting daytime passing times (1:30PM and 10:30AM, respectively): TROPOMI shows higher CO over Africa than MOPITT, consistent with higher CO emissions from afternoon fires than from morning fires. (Fires are commonly more active in the afternoon than in the morning, as observed in fire counts from same day morning Terra MODIS versus afternoon Aqua MODIS (?).) We also note that TROPOMI retrievals over Amazonia are lower than MOPITT's in all seasons. Identifying the reason for this discrepancy will require further investigation.

Quantitative results from the analysis of colocated TROPOMI and MOPITT land retrievals, summarized in Fig. ?? and Table ????, also show good agreement. Relative biases for all ROIs (-3.73  $\pm$  11.51, -2.24  $\pm$  12.38, and -3.22  $\pm$  11.13 % compared to MOPITT TIR, NIR, and TIR+NIR, respectively) are well within TROPOMI's required 15 % accuracy and close to 10 % precision target (??). We note that biases are mostly negative (i.e., TROPOMI retrievals are lower than MOPITT); further analyses would be needed to explain this observation. One exception is China, where biases are predominantly positive. Statistical results obtained from each of the three MOPITT products are consistent with each other for all the ROIs, except for the Sahara. In this case, relative biases between TROPOMI and MOPITT NIR are positive and closer to zero than biases between TROPOMI and TIR or TIR+NIR products. Results from non-colocated retrievals, available in the Supplement Section and summarized in Fig. ??, reinforce all these observations and provide additional insight.

Several factors may contribute to the contrasting results for the China ROI. First, because of its superior spatial resolution (7.2 x 7.2 km<sup>2</sup>), TROPOMI can resolve small, highly polluted plumes which would appear diluted at MOPITT's 22 x 22 km<sup>2</sup>

resolution. Second, TROPOMI provides daily global coverage, while MOPITT's return period is approximately three days; as a result, TROPOMI has more opportunities to sample highly polluted areas than MOPITT. Third, conservative MOPITT cloud mask rules may be responsible for fewer MOPITT retrievals over highly polluted regions, which are frequently hazy due to aerosols. Detailed daily maps (e.g., Fig. ??) obtained in the analysis of non-colocated observations indicate that MOPITT often fails to retrieve over highly polluted areas like Beijing (China). In this example many MOPITT observations, despite having been classified as cloud-free based on MOPITT radiances, were labeled cloudy (and no retrieval was performed) based on the MODIS cloud mask, which may be interpreting haze due to pollution or fire smoke as clouds. We note that comparisons of non-colocated retrievals are more strongly affected by these factors; this is consistent with particularly high positive biases derived from non-colocated retrievals over China (Fig. ??).

Possible causes for the contrasting relative biases obtained from the MOPITT NIR product over the Sahara include aerosol and/or surface albedo effects. Further work is needed to diagnose these effects for different wavelengths and to account for differences between MOPITT and TROPOMI measurement and retrieval methods. Determining the most accurate retrievals would require *in situ* CO column measurements (e.g., airborne profiles) that are not currently available for that region.

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There appears to be a seasonal component in MOPITT/TROPOMI bias values in the two hemispheric ROIs and Australia. Polluted ROIs (USA, Europe, India, China) and the Sahara do not seem to be affected (Fig. ??, ??, and ??). Biases between MOPITT and null-space adjusted TROPOMI retrievals show the same seasonal component, indicating that it is not caused by the MOPITT *a priori*. The seasonal variability of MOPITT has been validated in the past using ground-based measurements. In their comparison to NDACC data (Network for the Detection of Atmospheric Composition Change;

?), ? found no significant seasonally dependent bias for MOPITT products. ? compared MOPITT to the TCCON dataset, reporting no persistent seasonal trend globally and some seasonal variability for individual sites. Further work will be needed to identify the origin of a possible seasonal component in MOPITT/TROPOMI bias values.

We have also analyzed daytime, colocated TROPOMI and ATom-4 data over the Atlantic and Pacific regions for the period between 24 April and 21 May 2018 to quantify the error introduced in TROPOMI retrievals over bodies of water (possible only under cloudy conditions) by approximating below-cloud-top partial columns with their colocated, scaled reference profiles. There is excellent agreement (-4.76  $\pm$  11.15 % relative bias, i.e., below the mission requirement of 15 % accuracy and close to the 10 % precision target (??)) between ATom-4 total columns calculated from the true (unsmoothed) *in situ* profiles and the reported TROPOMI total columns (Fig. ??.a). Retrieval-simulated ATom total CO column values are even closer to the TROPOMI retrievals (3.25  $\pm$  11.46 % relative bias); this comparison accounts for the actual vertical sensitivity of the retrieval process as expressed in the TROPOMI AK, and summarizes the overall performance of the retrievals. The relative contributions of  $e_{null}$  with respect to true ATom-4 total CO columns are small (2.16  $\pm$  2.23 %) and mostly positive, indicating a slight overestimate of the below-cloud partial column in the cases analyzed. No clear latitudinal dependence is observed in relative biases of total CO column or in  $e_{null}$ .

For an analysis of TROPOMI retrievals over bodies of water representative of a longer period of time (7 November 2017 to 10 March 2019) and larger region (N and S Hemisphere ROIs), we used colocated MOPITT TIR observations in a simple above and below cloud approach which would be most accurate for optically thick clouds. Colocated TROPOMI and MOPITT

TIR total CO columns (above and below cloud top) and their corresponding partial column (above cloud top) components were analyzed separately. We interpret the difference between total column and partial column relative biases (-0.78. Untransformed TROPOMI retrievals result in relative bias values of 2.98 % on average; relative standard deviation of the bias are 15.71 % on average.

The main goal of the MOPITT/TROPOMI comparisons was to quantify differences using the untransformed retrievals: results have been discussed above. A secondary goal was to analyze the contributions of different sources of retrieval bias. Two fundamental sources are differences in vertical sensitivity, as defined by the total column AK, and differences between the MOPITT a priori and TROPOMI reference profiles. We estimated the error due to differences between the shape of the TROPOMI reference profile and that of the ATom true profile by calculating  $e_{null}$  respect to ATom-4 measurements; this error is in the order of 2 %. Without knowing the true CO profiles, there is no obvious way to quantify how differences in the total column AK influence the MOPITT/TROPOMI retrieval differences. We can, however, use the null-space adjustment technique to examine how sensitive MOPITT/TROPOMI differences are to a priori/reference profile discrepancies. Our results indicate that biases between MOPITT and null-space adjusted TROPOMI retrievals (Tables ?? and ??) are very close to biases between MOPITT and TROPOMI untransformed retrievals (Tables ?? and ??). By accounting for differences between a priori and reference profiles, the absolute value of relative biases over land decrease by 1.21, 1.17, and 1.23 percentage points, or p.p., on average (for MOPITT TIR, NIR, and TIR+NIR, respectively). The change in relative standard deviation values is also very small (0.06, 0.02, and 0.08 p.p.) as an estimate of the on average). Similarly, relative biases over bodies of water change by 1.88 p.p. on average; the change in relative standard deviation values is 0.06 p.p. on average. To sum up, the error introduced by approximating below-cloud-top CO with discrepancies between MOPITT a priori profiles and TROPOMI reference profiles. A similar analysis using ATom-4 profiles instead of MOPITT TIR profiles, presented in the Supplement Materials, results in a -3.65 is very small, near 1-2 p.p. estimated error. As expected, this error is slightly larger under cloudy conditions, as is the case in TROPOMI retrievals over water.

## 6 Conclusions

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A consistent global record of tropospheric CO is important for climate studies as well as for air quality monitoring and prediction. To better understand TROPOMI in the context of the current CO satellite record and thus facilitate the record's extension, we have compared TROPOMI data to other satellite (MOPITT) and airborne (ATom) datasets. Our results show that the accuracy and precision of TROPOMI retrievals with respect to MOPITT and ATom satisfy far exceeds Sentinel-5P mission requirements (??). The precision values calculated for some of the ROIs analyzed surpass the target value by a few percent.

We have analyzed cloud-free, land-only TROPOMI and MOPITT retrievals from 7 November 2017 to 10 March 2019 over ROIs representative of clean, polluted, and hemispheric regions in order to compare total CO column values from the two instruments. ATom being restricted mostly to oceanic regions precludes the use of this *in situ* dataset for fully validating TROPOMI retrievals over land; to. To that end, *in situ* data from other airborne measurement programs are required. Ground-based measurements (e.g., NDACC, TCCON) could also be used; this would allow the validation of seasonal variability at fixed

locations. Quantitative comparisons between TROPOMI and MOPITT retrievals over land are relevant, nevertheless. The MOPITT dataset represents the longest global CO record available (2000-present); because of extensive validation efforts with respect to *in situ* measurements and comparisons with other satellite datasets, it is well characterized. Additionally, MOPITT products have served as the reference for many other satellite retrieval products for CO, including AIRS (?), TES (?), and IASI (??). Furthermore, TROPOMI and MOPITT are currently the only were, until TANSO-FTS-2 became operational in 2019, the only working satellite instruments retrieving CO from NIR solar-reflected radiances. Thus, it is important to understand their relative behavior, particularly because we are interested in continuing the MOPITT multispectral record (which has enhanced sensitivity to near surface CO for some land observations (?)) using radiances from TROPOMI (NIR) and SNPP-CrIS (TIR), two instruments on satellites flying in loose formation (?). While our TROPOMI-MOPITT comparisons do not fully account for the contrasting vertical sensitivities of these two instruments, their results show that there is excellent agreement between the two datasets.

To analyze TROPOMI retrievals over bodies of water, only possible in cloudy conditions, we have used both ATom-4 *in situ* data (24 April to 21 May 2018) and MOPITT TIR retrievals (7 November 2017 to 10 March 2019). The ATom comparison allowed full validation using the TROPOMI AK. This is the ideal situation, since retrieval-simulated ATom-4 column values (i.e., ATom-4 values smoothed using the TROPOMI AK) explicitly account for the TROPOMI retrieval vertical sensitivity (unlike TROPOMI/MOPITT comparisons). The MOPITT comparison provided useful information for a longer period and wider geographical extent, although with the same restrictions noted above regarding the land-only comparisons. Our analyses over bodies of water indicate that TROPOMI's use of reference profiles in cloudy conditions results in errors on the order of a few percent. Since there are no major CO sources over water, CO values closer to the surface (and, therefore, most likely to be below cloud top) tend to be spatially homogeneous and stable through time. Thus, they are well characterized by the reference profiles. (Caution should be exercise in case of sporadic CO sources near open water, e.g., fires near a coastline, which could in some cases result in plumes transported off the coast and below cloud top. Larger errors could occur in such retrievals over water, if sources were not well represented in the TM5 model.) Depending on the representativeness of the TROPOMI reference profiles, larger errors may occur in TROPOMI land retrievals under cloudy conditions, particularly near CO emission sources. These errors require further characterization with colocated *in situ* data and ground measurements over land.

Data availability. TROPOMI level 2 CO retrievals for the 7 November 2017 to 27 June 2018 were downloaded from https://s5pexp.copernicus.eu/; retrievals for dates after 28 June 2018 were downloaded from https://s5phub.copernicus.eu/. TROPOMI reference profiles were obtained from ftp://ftp.sron.nl/pub/jochen/TROPOMI\_apriori/tm5\_co/. MOPITT data can be downloaded from https://doi.org/10.5067/TERRA/MOPITT/MOP02T\_L2.008 (TIR), MOP02N\_L2.008 (NIR), and MOP02J\_L2.008 (TIR+NIR). ATom-4 data from the 7 September 2019 version were downloaded from https://doi.org/10.3334/ORNLDAAC/1581.

Competing interests. The authors declare that they have no conflict of interest.

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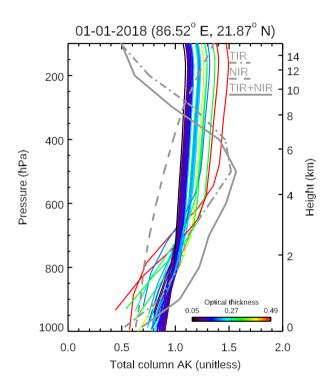
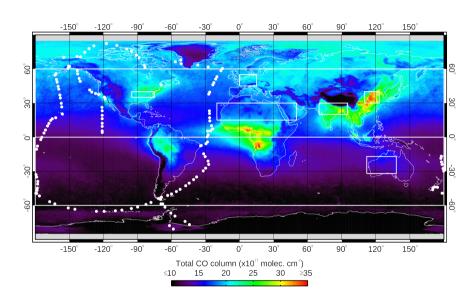
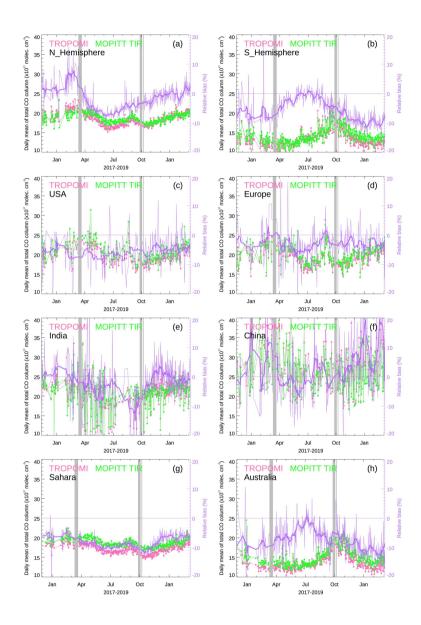


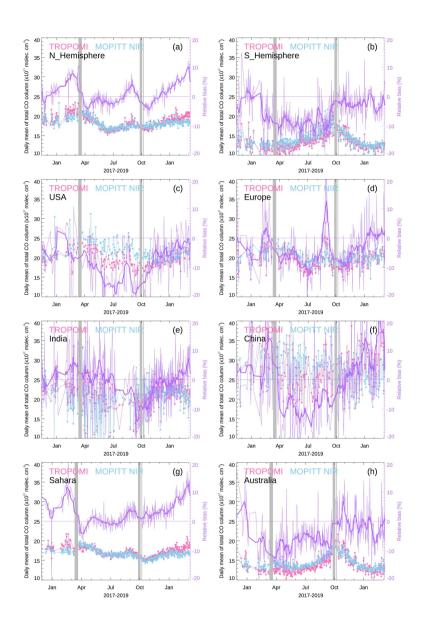
Figure 1. Total column AK (averaging kernels) from MOPITT and TROPOMI observations acquired 1 January 2018. Gray lines show AK from a single clear MOPITT pixel. Color-coded lines show AK from TROPOMI observations colocated with that MOPITT pixel (same day acquisition,  $\leq 50$  km horizontal distance) with optical depth <0.5 and cloud height <5000 m (i.e., clear-sky, clear-sky-like, and mid-level-cloud observations). Differences in TROPOMI AK vertical extent are due to topography.



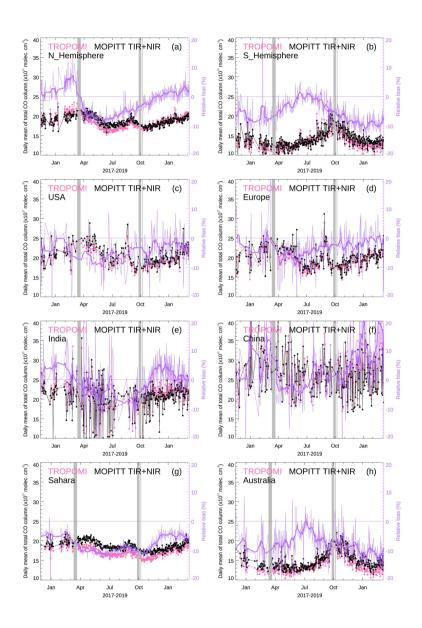
**Figure 2.** White rectangles show the location of land-only ROIs analyzed: N Hemisphere (0°N to 60°N), S Hemisphere (60°S to 0°N), USA (35°N, 95°W to 40°N, 75°W), Europe (45°N, 0°E to 55°N, 15°E), India (20°N, 70°E to 30°N, 95°E), China (30°N, 110°E to 40°N, 123°E), Sahara (15°N, 20°W to 30°N, 50°E), and Australia (32°S, 112°E to 17°S, 138°E). White circles indicate location of individual CO profiles acquired in April-May 2018, during the ATom-4 airborne campaign. Background map shows mean MOPITT TIR total CO column values for 2018.



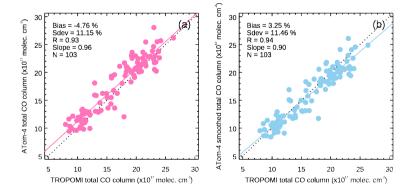
**Figure 3.** Comparison of colocated land retrievals from TROPOMI (pink) and MOPITT TIR (green) for each ROI analyzed. Filled circles show daily mean. Thin purple lines indicate daily relative bias (i.e., accuracy) between the two datasets, thick purple lines are a 11-day smoothed version with high-frequency variability removed. Gray bars show periods without MOPITT measurements because of hot calibrations (March and October 2018) or a safe mode maneuver (October-November 2018).



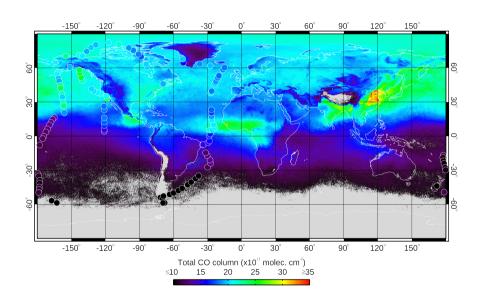
**Figure 4.** Comparison of colocated land retrievals from TROPOMI (pink) and MOPITT NIR (blue) for each ROI analyzed. See caption to Fig. ?? for details.



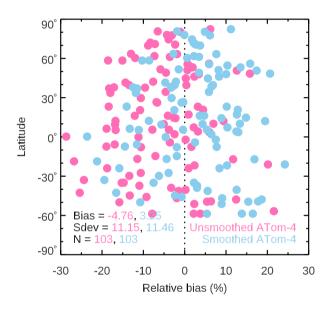
**Figure 5.** Comparison of colocated land retrievals from TROPOMI (pink) and MOPITT TIR+NIR (black) for each ROI analyzed. See caption to Fig. ?? for details.



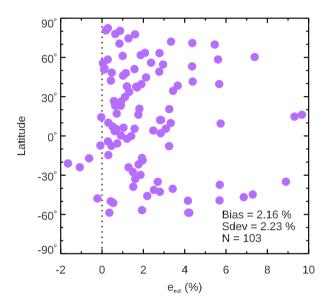
**Figure 6.** Comparison of colocated retrievals over bodies of water from TROPOMI and ATom-4 (24 April - 21 May 2018). a) TROPOMI versus true (unsmoothed) ATom-4. b) TROPOMI versus retrieval-simulated (smoothed) ATom-4.



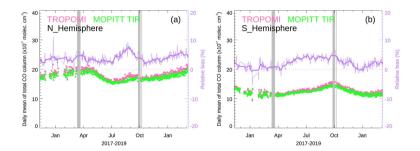
**Figure 7.** Map of averaged TROPOMI total CO column values acquired between 24 April and 21 May 2018, the duration of the ATom-4 campaign. Circles show ATom-4 profiles spatially and temporally colocated with single TROPOMI retrievals; circles are color-coded according to their retrieval-simulated (smoothed) ATom total CO column value. There is good agreement between the two datasets, despite differences in the time span and footprint size each of them represents.



**Figure 8.** Latitudinal distribution of relative bias between TROPOMI and ATom-4 over bodies of water. Negative bias indicates that TROPOMI retrievals are low with respect to ATom-4.



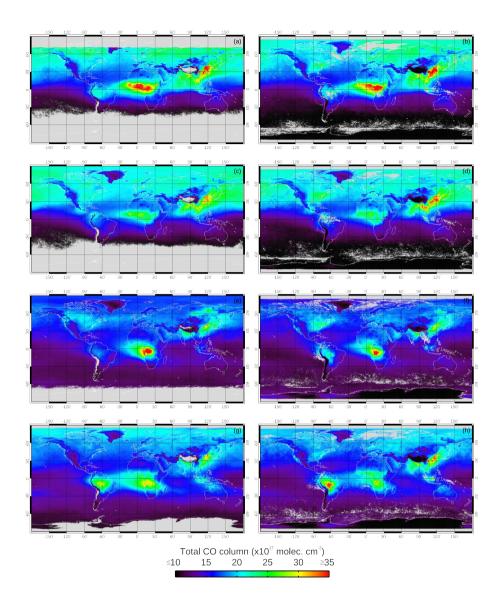
**Figure 9.** Latitudinal distribution of  $e_{null}$  error (see Eq. (??)), which characterizes retrieval errors over cloudy scenes related to the shape of the TROPOMI model-calculated reference profiles, expressed in percentage with respect to the true (unsmoothed) ATom-4 total CO columns.



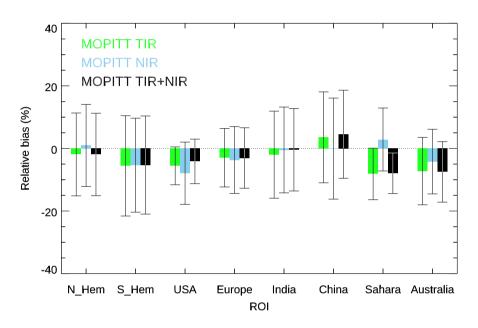
**Figure 10.** Comparison of colocated retrievals over bodies of water from TROPOMI and MOPITT TIR<del>for the N Hemisphere ROI</del>. a) Total CO column values (above and below cloud top) for a single day, 1 January 2018. b) Partial CO column values (above cloud only) for the same day. c) Compilation of means and relative biases of total CO column values (above and below cloud top) from 7 November 2017 to 10 March 2019. d2019 for the N Hemisphere ROI. b) Same for partial CO column values (above-cloud only) the S Hemisphere ROI.

Comparison of colocated retrievals over bodies of water from TROPOMI and MOPITT TIR for the S Hemisphere ROI.

a) Total CO column values (above and below cloud top) for a single day, 1 January 2018. b) Partial CO column values (above-cloud only) for the same day. e) Compilation of means and relative biases of total CO column values (above and below cloud top) from 7 November 2017 to 10 March 2019. d) Same for partial CO column values (above-cloud only).



**Figure 11.** Seasonal averages of TROPOMI and MOPITT TIR CO retrievals. a) December 2017 to February 2018 (DJF) TROPOMI mean. b) Same for MOPITT. c) March-May 2018 (MAM) TROPOMI mean. d) Same for MOPITT. e) June-August 2018 (JJA) TROPOMI mean. f) Same for MOPITT. g) September-November 2018 (SON) TROPOMI mean. h) Same for MOPITT. Sharp discontinuities visible in some panels at 65°S are due to differences in the definition of the MOPITT cloud mask poleward of latitude 65°.



**Figure 12.** Summary of colocated land comparison results. Colored bars represent relative bias between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR); solid lines indicate the standard deviation of relative bias

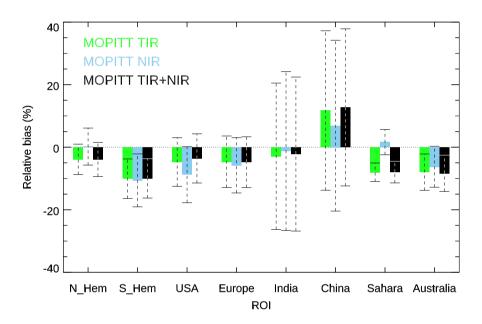
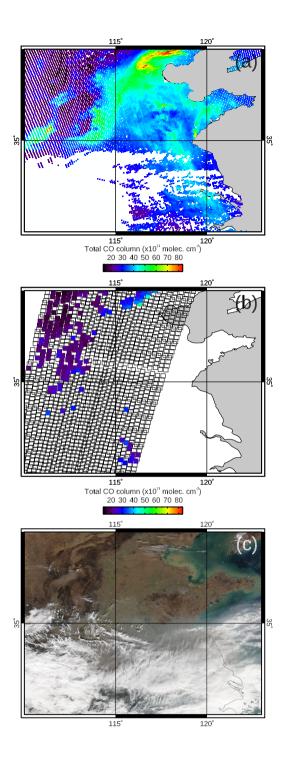


Figure 13. Summary of non-colocated land comparison results. Colored bars represent relative bias between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR). Solid Dashed lines show  $\pm$  1 standard deviation of mean daily relative biases (i.e., inter-daily bias variability).



**Figure 14.** Total CO column retrievals and visible image for the China ROI on 1 January 2018. a) TROPOMI map. b) MOPITT TIR+NIR map. c) Terra-MODIS visible image acquired at the same time as the MOPITT data. Empty boxes in the second panel correspond to MOPITT observations deemed cloudy based on MODIS cloud mask information, and thus not suitable for CO retrieval. The MODIS visible image shows clouds in the southern half of the ROI; the northern half was halfy, most probably due to pollution, but cloud-free.

**Table 1.** Statistics from colocated TROPOMI versus MOPITT CO retrievals over land for the period between 7 November 2017 and 10 March 2019. Relative bias and standard deviation in %. Column bias and standard deviation in units of  $10^{17}$  molec. cm<sup>-2</sup>.

		TROPOMI vs MOPITT <sub>TIR</sub>	TROPOMI vs MOPITT <sub>NIR</sub>	TROPOMI vs MOPITT <sub>TIR+1</sub>
N Hemisphere	Relative Bias±St. Dev.	-1.91±13.24	0.97±13.12	-1.92±13.17
	Column Bias±St. Dev.	-0.55-0.55±2.51	$-0.04\pm2.58$	$-0.55 \pm 2.45$
	Mean Daily Colocated Pairs	45672	45678	45530
S Hemisphere	Relative Bias±St. Dev.	-5.56±16.04	-5.36±15.02	-5.31±15.68
	Column Bias±St. Dev.	$-1.02\pm2.50$	$-0.95\pm2.32$	$-0.95\pm2.30$
	Mean Daily Colocated Pairs	7768	7771	7748
USA	Relative Bias±St. Dev.	-5.55±6.05	-7.93±9.95	-4.14±7.11
	Column Bias±St. Dev.	$-1.25\pm1.33$	$-2.02\pm2.36$	$-1.00\pm1.53$
	Mean Daily Colocated Pairs	666	686	666
Europe	Relative Bias±St. Dev.	-2.96±9.35	-3.69±10.69	-3.05±9.68
	Column Bias±St. Dev.	$-0.73\pm1.84$	$-0.91\pm2.29$	$-0.79\pm2.04$
	Mean Daily Colocated Pairs	657	661	656
India	Relative Bias±St. Dev.	-2.00±13.92	-0.48±13.71	-0.41±13.18
	Column Bias±St. Dev.	$-0.74 \pm 2.80$	$-0.47 \pm 2.90$	$-0.38\pm2.43$
	Mean Daily Colocated Pairs	1122	1133	1118
China	Relative Bias±St. Dev.	3.55±14.52	-0.06±16.15	4.53±14.08
	Column Bias±St. Dev.	$0.74 \pm 4.00$	$-0.37 \pm 4.64$	$0.98 \pm 3.86$
	Mean Daily Colocated Pairs	533	566	534
Sahara	Relative Bias±St. Dev.	-8.15±8.22	2.86±10.06	-7.94±6.48
	Column Bias±St. Dev.	$-1.64 \pm 1.64$	$0.34{\pm}1.72$	-1.55±1.27
	Mean Daily Colocated Pairs	15214	15223	15169
Australia	Relative Bias±St. Dev.	-7.23±10.77	-4.20±10.33	-7.49±9.68
	Column Bias±St. Dev.	$-1.28\pm1.85$	$-0.69 \pm 1.52$	$-1.26\pm1.57$
	Mean Daily Colocated Pairs	1873	1875	1869
Mean all ROIs	Relative Bias±St. Dev.	-3.73±11.51	-2.24±12.38	-3.22±11.13
	Column Bias±St. Dev.	$-0.81\pm2.31$	$-0.64 \pm 2.54$	$-0.69\pm2.18$
	Mean Daily Colocated Pairs	9188	9199	9161

**Table 2.** Colocated TROPOMI versus ATom-4 CO retrievals over bodies of water: Statistics from AK analysis. Relative bias and standard deviation in %. Column bias and standard deviation in units of  $10^{17}$  molec. cm<sup>-2</sup>.

		TROPOMI vs True ATom-4	TROPOMI vs Retrieval-Simulated ATom-4
		(Unsmoothed)	(Smoothed)
Atlantic/Pacific	Relative Bias±St. Dev.	-4.76±11.15	$3.25 \pm 11.46$
	Column Bias±St. Dev.	$-0.89 \pm 1.80$	$0.46 \pm 1.68$
	Number of Colocated Pairs	103	103

**Table 3.** Colocated TROPOMI versus MOPITT TIR CO retrievals over bodies of water: Statistics from above/below cloud analysis performed for the period between 7 November 2017 and 10 March 2019. Total column = above and below cloud top. Partial column = above cloud top. Relative bias and standard deviation in %. Column bias and standard deviation in units of 10<sup>17</sup> molec. cm<sup>-2</sup>.

		TROPOMI vs MOPITT $_{TIR}$ TROPOMI vs MOPITT $_{TIR}$ Total Column $_{Partial}$ Column
N Hemisphere	Relative Bias±St. Dev.	3.82±13.27 <mark>4.35±14.72</mark>
	Column Bias±St. Dev.	$0.53{\pm}2.35$
0.48	Mean Daily Colocated Pairs	127360
S Hemisphere	Relative Bias±2.04St. Dev.	2.14±18.15
	Column Bias±St. Dev.	$0.19\pm2.38$
	Mean Daily Colocated Pairs	<del>127360</del> 164935
127360 Mean both Hemispheres	Relative Bias, St. Dev.	$2.98 \pm 15.71$
	Change in Relative Bias(p. p.)Column Bias±St. Dev.	$0.36\pm2.37$
	Mean Daily Colocated Pairs	146148

**Table 4.** Statistics from colocated, null-space adjusted TROPOMI versus MOPITT CO retrievals over land for the period between 7 November 2017 and 10 March 2019. Relative bias and standard deviation in %. Column bias and standard deviation in units of 10<sup>17</sup> molec. cm<sup>-2</sup>.

		TROPOMI vs MOPITT <sub>TIR</sub>	TROPOMI vs MOPITT <sub>NII</sub>
N Hemisphere	Relative Bias±St. Dev.	-1.19±13.31	1.68±13.05
	Column Bias±St. Dev.	$-0.40\pm2.52$	$0.10\pm 2.55$
	Mean Daily Colocated Pairs	45672	45678
S Hemisphere	Relative Bias±St. Dev.	2.14-4.74±18.1516.08	<del>3.16</del> -4.60±21.4914.90
	Column Bias±St. Dev.	$0.19 - 0.91 \pm 2.382.49$	$0.24 - 0.83 \pm 2.14 + 2.28$
	Mean Daily Colocated Pairs	<del>164935</del> 7768	<del>164935</del> 7771
<u>ŲS</u> A	Change in Relative Bias(p. p.)Relative Bias±St. Dev.	-2.62±6.21	-5.12±10.19
	Column Bias±St. Dev.	$-0.65\pm1.34$	-1.42±2.36
	Mean Daily Colocated Pairs	<u>666</u>	686
Mean both Hemispheres Europe	Relative Bias, Relative Bias±St. Dev.	-0.97±9.49	-1.72±10.88
	Column Bias±St. Dev.	-0.34±1.85	- <u>0.52±2.30</u>
	Mean Daily Colocated Pairs	<u>657</u>	<u>661</u>
<u>India</u>	Relative Bias±St. Dev.	<del>2.98</del> -0.95± <del>15.71</del> 13.84	<del>3.76</del> 0.52± <del>18.11</del> 13.59
	Column Bias±St. Dev.	<del>0.36</del> - <u>0.4</u> 8± <del>2.37</del> 2.79	$0.36$ - $0.21\pm2.09$ 2.85
	Mean Daily Colocated Pairs	<del>146148</del> 1122	<del>146148</del> 1133
China	Change in Relative Bias(p. p.)Relative Bias±St. Dev.	5.44±14.59	1.77±16.19
	Column Bias±St. Dev.	$1.25 \pm 4.00$	$0.16 \pm 4.61$
	Mean Daily Colocated Pairs	533	<u>566</u>
Sahara	Relative Bias±St. Dev.	-8.00±8.24	3.02±10.05
	Column Bias±St. Dev.	$-1.61\pm1.64$	0.37±1.71
	Mean Daily Colocated Pairs	15214	15223
Australia	Relative Bias±St. Dev.	-7.13±10.76	-4.11±10.32
	Column Bias±St. Dev.	-1.27±1.85	- <u>0.68±1.52</u>
	Mean Daily Colocated Pairs	1873	1875
Mean all ROIs	Relative Bias±St. Dev.	-2.52±11.57	-1.07±12.40
	Column Bias±St. Dev.	$-0.55 \pm 2.31$	$-0.38 \pm 2.52$
	Mean Daily Colocated Pairs	9188	9199

**Table 5.** Colocated, null-space adjusted TROPOMI versus MOPITT TIR CO retrievals over bodies of water: Statistics analysis performed for the period between 7 November 2017 and 10 March 2019. Relative bias and standard deviation in %. Column bias and standard deviation in units of  $10^{17}$  molec. cm<sup>-2</sup>.

		TROPOMI vs MOPITT <sub>TIR</sub> <u>Total Column</u>
N Hemisphere	Relative Bias±St. Dev.	5.90±13.19
	Column Bias±St. Dev.	$0.91 \pm 2.32$
	Mean Daily Colocated Pairs	127360
S Hemisphere	Relative Bias±St. Dev.	3.82±18.11
	Column Bias±St. Dev.	$0.39 \pm 2.36$
	Mean Daily Colocated Pairs	164544
Mean both Hemispheres	Relative Bias, St. Dev.	4.86±15.65
	Column Bias±St. Dev.	$0.65\pm2.34$
	Mean Daily Colocated Pairs	145952

# 1.5 years of TROPOMI CO measurements: Comparisons to MOPITT and ATom - SUPPLEMENT MATERIALS

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#### S1 TROPOMI versus MOPITT over land: non-colocated retrievals

Here we describe results from the analysis of daily (from 7 November 2017 to 10 March 2019) non-colocated TROPOMI and MOPITT retrievals over 8 ROIs : 2 hemispheric, 4 representative of polluted regions (USA, Europe, India, and China), and 2 of clean regions (Saharaand Australia). (regions of interest). Polluted ROIs include: south-eastern USA (USA; 35°N, 95°W to 40°N, 75°W), central Europe (Europe; 45°N, 0°E to 55°N, 15°E), northern half of the Indian Subcontinent (India; 20°N, 70°E to 30°N, 95°E), and north-eastern China (China; 30°N, 110°E to 40°N, 123°E). Clean ROIs are: northern Africa and Arabia (Sahara; 15°N, 20°W to 30°N, 50°E) and western Australia (Australia; 32°S, 112°E to 17°S, 138°E). Two additional ROIs represent most of the northern and southern (N and S) hemispheres (0°N to 60°N and 60°S to 0°N, respectively). TROPOMI and MOPITT retrievals were filtered to keep only clear daytime data over land. Daily mean retrievals for each dataset as well as relative bias between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR) were calculated; relative bias = 100\*(TROPOMI-MOPITT)/MOPITT. By utilizing non-colocated retrievals we maximized the size and diversity of the populations analyzed. Results from this analysis are summarized in Fig. S1.

### S1.1 TROPOMI versus MOPITT TIR

Results summarized in Fig. S2 show that during the ~1.5 year analyzed, TROPOMI and MOPITT TIR total CO column retrievals were close to each other both in magnitude and temporal variation. The two datasets show strong differences between clean ROIs (Sahara and Australia; 10-20 x 10<sup>17</sup> molec. cm<sup>-2</sup>) and highly polluted ROIs (India and China; up-to-40 x 10<sup>17</sup>

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molec. cm<sup>-2</sup>). They also show the expected differences between the two hemispheres: retrievals are, overall, lower in the S Hemisphere (10-20 x  $10^{17}$  molec. cm<sup>-2</sup> versus 16-22 x  $10^{17}$  molec. cm<sup>-2</sup>) due to less land area, population, and industrial activity. Both TROPOMI and MOPITT TIR show equivalent seasonal variability. ROIs located in the Northern hemisphere present an absolute maximum during boreal winter and a relative maximum in late boreal summer. The absolute maximum is consistent with winter CO accumulation due to shorter days and larger zenithal angles, resulting in less photolysis, and to increased emissions due to biomass burning north of the Equator in Africa. The relative maximum is most likely due to fire emissions. Conversely, seasonal trends in Southern hemisphere ROIs show a maximum in September-October, consistent with CO accumulation during austral winter and emissions from biomass burning S of the equator. Daily relative bias values are generally within a  $\pm 10$  % range for all the ROIs except the two most polluted (India and China), where most values are between -20 to +40 %. When averaged over time (Table S1), relative biases are between -10.07 % (S Hemisphere) and 11.73 % (China), with a mean for all the ROIs of -3.81 %. We note that biases for most ROIs are predominantly negative, except for China.

#### S1.2 TROPOMI versus MOPITT NIR

Figure S3 shows daily results from the comparison of non-colocated TROPOMI and MOPITT NIR land retrievals; time-averaged results are summarized in Table S1. The ranges of daily mean retrievals and seasonal trends observed in each ROI are in general analogous to those described in Sect. S1.1. Relative bias values averaged for the period analyzed range between -10.60 % (S Hemisphere) and 6.88 % (China), while the mean for all the ROIs is -2.99 %. Bias values for the Sahara ROI (mostly in the -5 to 10 % range) contrast strongly with those shown in Fig. S2.g (-10 to -5 %). For all the other ROIs, relative biases with respect to MOPITT NIR are broadly similar in magnitude to those respect MOPITT TIR, albeit the former present larger oscillations along time. This is consistent with the MOPITT NIR retrievals being more sensitive to geophysical noise due to changes in albedo during MOPITT observation associated with spacecraft motion (Deeter et al., 2011).

### S1.3 TROPOMI versus MOPITT TIR+NIR

Daily results from non-colocated TROPOMI and MOPITT TIR+NIR retrievals are shown in Fig. S4; temporally averaged results are summarized in Table S1. Results are similar to those described in Sect. S1.1 in terms of daily means, seasonal trends, and relative biases. The latter range between -9.96 % (S Hemisphere) and 12.73 % (China); the mean for all ROIs is -3.50 %.

### S2 TROPOMI versus MOPITT TIR over water: above/below cloud analysis

The goal of this analysis was to calculate the maximum error caused by the use of reference CO profiles in TROPOMI retrievals over water. To this effect, we assumed that TROPOMI retrievals are only sensitive to CO above cloud top, while CO below cloud top is fully approximated by TROPOMI's scaled reference profiles. This scenario would be most accurate in case of optically thick clouds. To quantify this error, we compared TROPOMI retrievals over bodies of water (total columns and their above cloud partial column components) to their colocated MOPITT TIR counterparts. For each TROPOMI observation, a

partial above cloud column was calculated by subtracting from the reported total TROPOMI column the below cloud partial column of its colocated, scaled TROPOMI reference profile, available in a 25-level vertical grid. Scaling factors produced in the TROPOMI retrieval process are not included in the TROPOMI product; we obtained those by dividing each reported TROPOMI total CO column retrieval by the total CO column of its colocated reference profile. Total and partial above cloud column values were also calculated for the colocated MOPITT TIR profiles interpolated to match the 25-level vertical grid of the reference profiles.

Figure S5 and Table S2 summarize results from our comparison of colocated TROPOMI and MOPITT TIR retrievals over bodies of water in the N Hemisphere ROI. The top panels in Fig. S5 illustrate a comparison between total column (above and below cloud top) and partial column (above cloud top) retrievals for a single day, 1 January 2018. Partial column values from TROPOMI and MOPITT are more strongly correlated in this particular date, as shown by a larger R (0.87 versus 0.73) and a smaller relative bias (2.77 versus 2.92 %). The bottom panels in Fig. S5 summarize similar daily results for the entire ~1.5-year period analyzed. Relative biases between TROPOMI and MOPITT TIR for total or partial columns are small (in the -2 to 11 % range, ~4 % on average) and follow the same temporal patterns; their differences (total column bias - partial column bias) range from -1.79 to 1.56 p.p. (percentage points), with a -0.53 p.p. mean. Standard deviation values are on average around 13-15 %.

Similar results for the S Hemisphere ROI are summarized in Fig. S6 and Table S2. Partial column values for 1 January 2018 (Fig. S6.b) have a larger R (0.84 versus 0.79) and appear more strongly correlated than their total column counterparts (Fig. S6.a). They, however, show a larger relative bias (2.16 versus 0.36 %). Similar results for the entire period analyzed (Fig. S6.c and .d) indicate that relative biases for either total or partial columns are similarly small, ranging from -5 to 7 (~3 % mean). Their differences are in the -3.62 to 0.97 p.p. range, with a -1.02 p.p. mean. Standard deviations are in the 18-21 % range.

Based on the difference in relative bias between the total (above and below cloud) and partial (above cloud) column analyses, we estimate that approximating TROPOMI CO below cloud top by scaled reference profiles results, on average, in a ~-0.78 p.p. error. This approach would be most accurate in the presence of optically thick clouds which would preclude TROPOMI sensitivity below cloud top.

## S3 TROPOMI versus ATom-4 over water: above/below cloud analysis

Results from an analysis of colocated TROPOMI and true (unsmoothed) ATom-4 profiles over bodies of water performed for the period between 24 April and 21 May 2018 are summarized in Fig. S7 and Table  $\ref{table}$ . Colocation criteria were same day acquisition and horizontal distance  $\leq 50$  km; each ATom-4 profile was paired with the closest valid TROPOMI retrieval that met the colocation criteria.

For this comparison The goal of this analysis was to calculate the maximum error caused by the use of reference CO profiles in TROPOMI retrievals over water. To this effect, we assumed that TROPOMI retrievals are only sensitive to CO above cloud top, while CO below cloud top is fully approximated by TROPOMI's scaled model-based reference profiles. This scenario would be most accurate in case of optically thick clouds. To quantify the error introduced by approximating below-cloud-top

CO with TROPOMI reference profilesthis error, we compared TROPOMI retrievals over bodies of water (total columns and their above cloud partial column components) to their colocated ATom-4 counterparts. Complete (e.g., from the surface to the top of the atmosphere) ATom-4 CO profiles were generated following the standard method for MOPITT validation with airborne data, as described in the main article. The complete profiles were then interpolated to match the TROPOMI reference profile 25-level vertical grid. ATom total CO column values were calculated applying Eq. 1-3 in main article. The corresponding ATom partial column values were also calculated, including only the layers above cloud top. For each TROPOMI observation, a partial above cloud column was calculated by subtracting from the reported total TROPOMI column the below cloud partial column of its colocated, scaled TROPOMI reference profile.

Fig. S7.a shows total CO column retrievals which, for TROPOMI, according to our assumption, would include a measured component (partial column above cloud top) and a reference component (partial column below cloud top). TROPOMI and ATom-4 total CO column values show very strong correlation (R = 0.93, slope of linear fit = 0.96) and a small negative relative bias (-4.76 %) indicative of slightly low TROPOMI values with respect to ATom-4. Figure S7.b shows results for partial (above cloud) CO column values. The relative bias in this case is closer to zero (-1.11 %) and the linear fit has a slightly larger R (0.95), indicative of an even stronger correlation between the above-cloud-only component of the two datasets; the slope of the linear fit is slightly lower (0.92). We interpret the difference between these two relative bias values (-3.65 p.p.) as an estimate of the error introduced by assuming that below-cloud partial CO columns can be approximated by TROPOMI scaled CO reference profiles. Results from this analysis characterize a worst-case scenario (where TROPOMI has no sensitivity to CO below cloud top) and they complement results from the TROPOMI versus ATom-4 analysis presented in the main article, where it is assumed that TROPOMI has some sensitivity to CO below cloud top.

# 100 References

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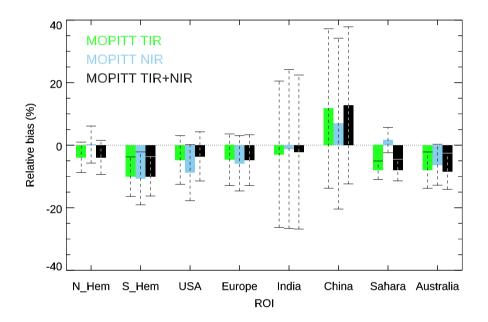
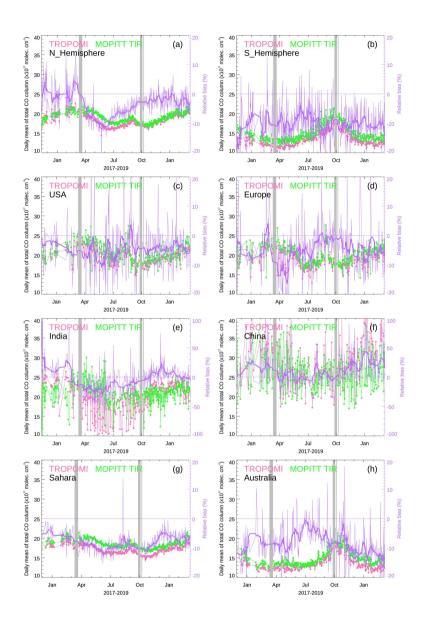
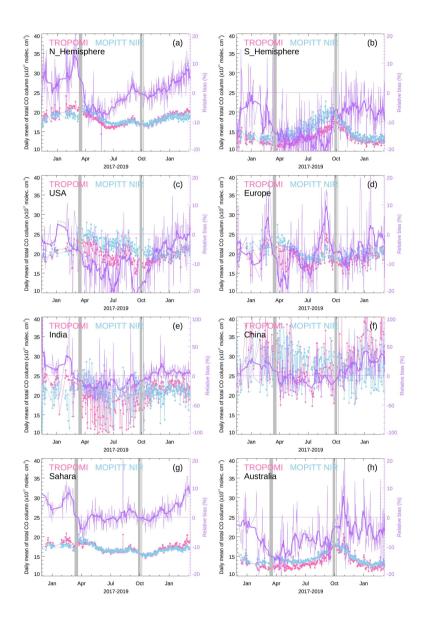


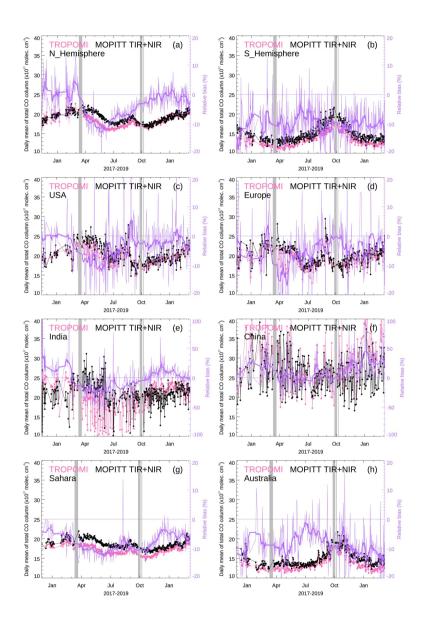
Figure S1. Summary of non-colocated land comparison results. Colored bars represent relative bias between TROPOMI and each of the three MOPITT products (TIR, NIR, and TIR+NIR). Solid Dashed lines show  $\pm$  1 standard deviation of mean daily relative biases (i.e., inter-daily bias variability). Same as Fig. 13 in the main article.



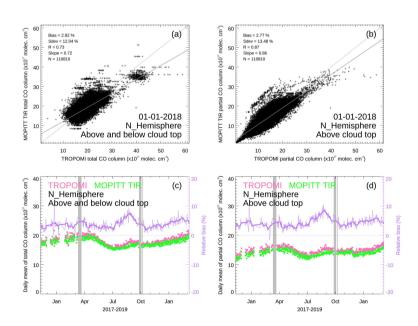
**Figure S2.** Comparison of non-colocated land retrievals from TROPOMI (pink) and MOPITT TIR (green) for each ROI analyzed. Filled circles show daily mean. Thin purple lines indicate daily relative bias between the two datasets, thick purple lines are a 11-day smoothed version with high-frequency variability removed. Gray bars show periods without MOPITT measurements because of hot calibrations (March and October 2018) or a safe mode maneuver (October-November 2018). Note that for the India and China ROIs the relative bias scale is different than for the other ROIs.



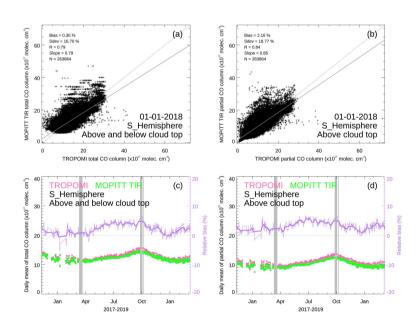
**Figure S3.** Comparison of non-colocated land retrievals from TROPOMI (pink) and MOPITT NIR (blue) for each ROI analyzed. See caption to Fig. S2 for details.



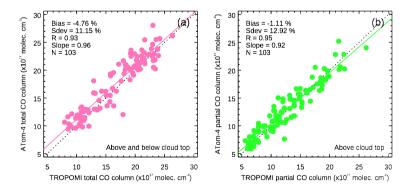
**Figure S4.** Comparison of non-colocated land retrievals from TROPOMI (pink) and MOPITT TIR+NIR (black) for each ROI analyzed. See caption to Fig. S2 for details.



**Figure S5.** Comparison of colocated retrievals over bodies of water from TROPOMI and MOPITT TIR for the N Hemisphere ROI. a) Total CO column values (above and below cloud top) for a single day, 1 January 2018. b) Partial CO column values (above-cloud only) for the same day. c) Compilation of means and relative biases of total CO column values (above and below cloud top) from 7 November 2017 to 10 March 2019. d) Same for partial CO column values (above-cloud only).



**Figure S6.** Comparison of colocated retrievals over bodies of water from TROPOMI and MOPITT TIR for the S Hemisphere ROI. a) Total CO column values (above and below cloud top) for a single day, 1 January 2018. b) Partial CO column values (above-cloud only) for the same day. c) Compilation of means and relative biases of total CO column values (above and below cloud top) from 7 November 2017 to 10 March 2019. d) Same for partial CO column values (above-cloud only).



**Figure S7.** Comparison of colocated retrievals over bodies of water from TROPOMI and true ATom-4 (unsmoothed), performed for the period between 24 April and 21 May 2018. a) Total column retrievals (above and below cloud top), b) Partial column retrievals (above cloud top only).

**Table S1.** Statistics from non-colocated TROPOMI (T) versus MOPITT (M) retrievals over land for the period between 7 November 2017 and 10 March 2019. Relative bias in %. Column bias in units of 10<sup>17</sup> molec. cm<sup>-2</sup>.

		TROPOMI vs MOPITT <sub>TIR</sub>	TROPOMI vs MOPITT <sub>NIR</sub>	TROPOMI vs MOPITT <sub>TIR+</sub>
N Hemisphere	Relative Bias	-3.88	0.19	-3.91
	Column Bias	-0.74	0.04	-0.75
	Mean Daily Samples (T, M)	151685, 15716	151685, 15855	151685, 14764
S Hemisphere	Relative Bias	-10.07	-10.60	-9.96
	Column Bias	-1.55	-1.69	-1.53
	Mean Daily Samples (T, M)	26551, 6287	26551, 6323	26551, 5992
USA	Relative Bias	-4.73	-8.77	-3.58
	Column Bias	-1.07	-1.99	-0.84
	Mean Daily Samples (T, M)	1559, 144	1559, 143	1564, 142
Europe	Relative Bias	-4.65	-5.78	-4.77
	Column Bias	-1.00	-1.20	-1.04
	Mean Daily Samples (T, M)	1680, 146	1680, 146	1680, 142
India	Relative Bias	-2.91	-1.21	-2.20
	Column Bias	-0.98	-0.68	-0.92
	Mean Daily Samples (T, M)	3831, 654	3822, 657	3852, 624
China	Relative Bias	11.73	6.88	12.73
	Column Bias	2.55	1.20	2.80
	Mean Daily Samples (T, M)	1395, 197	1392, 198	1395, 191
Sahara	Relative Bias	-8.01	1.64	-7.96
	Column Bias	-1.50	0.27	-1.50
	Mean Daily Samples (T, M)	50605, 4117	50605, 4143	50605, 3872
Australia	Relative Bias	-7.98	-6.26	-8.35
	Column Bias	-1.20	-0.90	-1.26
	Mean Daily Samples (T, M)	5918, 1311	5918, 1316	5918, 1263
Mean all ROIs	Relative Bias	-3.81	-2.99	-3.50
	Column Bias	-0.69	-0.62	-0.63
	Mean Daily Samples (T, M)	30403, 3572	30402, 3598	30406, 3374

**Table S2.** Colocated TROPOMI versus MOPITT TIR CO retrievals over bodies of water: Statistics from above/below cloud analysis performed for the period between 7 November 2017 and 10 March 2019. Total column = above and below cloud top. Partial column = above cloud top. Relative bias and standard deviation in %. Column bias and standard deviation in units of 10<sup>17</sup> molec. cm<sup>-2</sup>.

		TROPOMI vs MOPITT <sub>TIR</sub> Total Column	TROPOMI vs MOPITT <sub>TIR</sub> Partial Column
N Hemisphere	Relative Bias±St. Dev.	3.82±13.27	4.35±14.72
	Column Bias±St. Dev.	$0.53 \pm 2.35$	$0.48 \pm 2.04$
	Mean Daily Colocated Pairs	127360	127360
	Change in Relative Bias (p.p.)	-0	.53
S Hemisphere	Relative Bias±St. Dev.	2.14±18.15	3.16±21.49
	Column Bias±St. Dev.	$0.19 \pm 2.38$	$0.24 \pm 2.14$
	Mean Daily Colocated Pairs	164935	164935
	Change in Relative Bias (p.p.)	-1	.02
Mean both Hemispheres	Relative Bias, St. Dev.	2.98±15.71	3.76±18.11
	Column Bias±St. Dev.	$0.36 \pm 2.37$	$0.36\pm2.09$
	Mean Daily Colocated Pairs	146148	146148
	Change in Relative Bias (p.p.)	-0	.78

**Table S3.** Comparison of colocated retrievals over bodies of water from TROPOMI and true ATom-4 (unsmoothed): Statistics from above/below cloud analysis performed for the period between 24 April and 21 May 2018. Relative bias in %. Column bias in units of 10<sup>17</sup> molec. cm<sup>-2</sup>.

		TROPOMI vs true ATom-4 Above & Below Cloud Top	TROPOMI vs true ATom-4 Above Cloud Top
Atlantic/Pacific	Relative Bias±St. Dev.	-4.76±11.15	-1.11±12.92
	Column Bias±St. Dev.	$-0.89 \pm 1.80$	$-0.17 \pm 1.51$
	Number of Colocated Pairs	103	103
	Change in Relative Bias (p.p.)	.) -3.65	