Ye Yuan et al., Adaptive Baseline Finder, a statistical data selection strategy to identify atmospheric CO$_2$ baseline levels and its application to European elevated mountain stations

Answers to Anonymous Referee #1

The referee’s comments are in black, answers are in blue.

Short notice:
According to the suggestion from J. Kim (Referee #2), we changed the name of our method “Adaptive Baseline Finder (ABF)” into “Adaptive Diurnal Minimum Variation (ADMV)”. All the names and abbreviations of this method have been adjusted throughout the answer.

Yuan et al. present a data selection method for records of atmospheric CO$_2$ mole fraction observations from mountain locations. Their method, the adaptive baseline finder (ABF), is an interesting one and in that sense worth publishing. However, unfortunately the manuscript in its current form remains very descriptive and does not include clear conclusions on how the community would benefit from using this method in comparison to the other methods to which ABF is compared.

Another main point is that the English should be checked by a language editor, as in several places the manuscript is not written in correct English (e.g. articles are often omitted and commas are used incorrectly).

All in all, I think the authors have done a substantial amount of interesting work, and could be worth publishing after taking into account the specific comments below and especially focus on placing their work in larger context and making more explicit what the use of ABF could contribute to the field.

We would like to thank the referee for the very detailed and constructive comments. Besides answering all the specific comments respectively, we also added more explanations and arguments mainly in the Results and discussion, as well as the Conclusion section.

Specific comments:

Page 1 line 21: ‘measuring sites’ should be replaced by ‘measurement sites’, throughout the manuscript.

This was corrected.

Page 1 line 22: Why would this lead to a bias when comparing different stations? Only when the data of these different stations has been selected with different methods.

We apologize for the misleading wording. We replaced “bias” by “reduced compatibility.”

Also, it needs to be noted that different stations do have different methods for data selection and data processing due to different station characteristics and measurement conditions (including instrument, etc.). In a way, it is also true that data compatibility needs to be improved within GAW network. This methodological approach focuses on common structural features of measurement data from mountain stations with the aim of finding a more general solution for the selection of representative measurement data. The aim is to improve the compatibility of the data and to facilitate the conclusion from a point measurement to a larger area.
Page 1 line 23: pattern -> patterns
   This was corrected.

Page 1 line 24: ‘measuring records’ -> records of atmospheric CO2 observations
   This was corrected.

Page 1 line 27: implemented -> included/applied
   This was corrected.

Page 1 line 27: Among the studied methods, our ABF method …
   This was corrected, and the full name was added in the text above (because of the abbreviation used here).

Page 1 line 27: This is very descriptive: lower percentage of selected data; is this ‘better’? What does it imply to have less or more data selected?
   We added by the end of this sentence, “… which can be understood as a better representation of the lower free troposphere.”

Page 1 line 30: STL is not explained
   We rewrote the sentence, “The measured time series were analyzed for long-term trend and seasonality by seasonal-trend decomposition technique.”
   And STL would be explained later in detail in Section 2.4.

Page 2 line 13: what do you mean by correction for interference from other GHG?
   We added an example for the potential interference, “such as water vapor.”

Page 2 line 24: here it would be good to elaborate on the work of Uglietti et al. 2011 (ACP), which is referred to on the same page.
   Since the method for calculating the background corrected CO2 record was the same as Satar et al. (2016), we included the citation of Uglietti et al. (2011) at the end of Section 2.3 for the method description.
   Regarding the use of the transport model, we elaborated on the reference to the work of Uglietti et al. (2011) in the same paragraph but some lines further below when the modeling techniques were mentioned. The added sentence is, “Uglietti et al. (2011) focused on the origins of atmospheric CO2 at Jungfraujoch (Switzerland) by the FLEXible PARTicle dispersion model (FLEXPART).”

Page 2 line 29: explain why afternoon values should be excluded.
   We added, “… due to the influence of convective upward transport.”

Page 3 line 3: MHD flasks are only sampled during restricted base line conditions, so no filtering is applied.
   We apologize for the misleading wording. It is correct that MHD flasks were only sampled during Restricted Baseline Conditions (RBC), i.e. during periods with specific wind directions and
wind velocities requirements.

When citing this paper, we wanted to stress the approaches for aiming on a regional analysis instead of filtering technique. More details can be seen in Section 3 (Data selection) of Sirignano et al. (2010).

For this sentence, we rephrased as, “Threshold limits of 300 ppb for CO and 2000 ppb for CH₄ were defined by Sirignano et al. (2010) to perform a regional analysis of CO₂ data at Lutjewad (the Netherlands) and Mace Head (Ireland).”

Page 3 line 6: Hawaii, USA. Also add Switzerland for JFJ.
These were added.

Page 3 line 18: what is REBS?
We rephrased the sentence as, “Ruckstuhl et al. (2012) developed a method based on robust local regression, called Robust Extraction of Baseline Signal, to estimate…”

Page 3 line 23: why do the authors choose to focus on mountain sites only? This should be made more clear in the manuscript.

This work concentrates on finding common properties for the lower free troposphere in ground-based measurements. As the first approach data have been taken from mountain stations due to their remote location with limited anthropogenic influence and increased representativeness. We also focus on mountain sites only because mountain stations have a diurnal variation which results in a daily time window for well-mixed air with a better representation of the lower free troposphere. The explanation in Section 2.2 was improved considerably, which can be seen in the answers below.

Also, we added at the beginning of Section 2.1, “The data have been taken from mountain stations due to their remote location with limited anthropogenic influence and increased representativeness.”

Page 4 line 7-9: what do these classifications mean? E.g. “weakly influenced, constant deposition” is not very clear.

We added the explanation at the beginning of this sentence, “Henne et al. (2010) presented a method of categorizing site representativeness based on the influence and variability of population and deposition by the surface fluxes.”

Page 4 line 13: did you use hourly data or higher time resolution? This is not clear from this section.

Both time resolutions hourly and half-hourly are available. We used hourly data throughout the work except for the evaluation of the influences of different time resolutions (see Supplement S1.3).

Therefore, we added, “For this study, hourly data were used consistently, unless otherwise indicated.”

Page 4 line 15-16: specify which reference is for which station.
We added the station names in the sentence, “Schmidt et al. (2003) for SSL, Gilge et al. (2010)
for HPB and SNB, Gomez-Pelaez et al. (2010) for IZO, Risius et al. (2015) for ZSF and Schibig et al. (2015) for JFJ."

Page 4 line 19-20: This sentence is very vague, make more clear what the motivation of this research is.

We rephrased this sentence as, “ADMV is a tool for automatic and systematic analysis of diurnal CO\textsubscript{2} cycles at elevated mountain stations in order to select consecutive time sequences with minimum variation, which can be regarded as representing well-mixed air conditions.”

Page 4 line 21-22: This sentence is not clear: what traffic activities are relevant to the mountain sites? And why is vegetation active in the afternoon only? How about respiration?

We rephrased this sentence as, “For example, at ZSF, these can be characterized by anthropogenic CO\textsubscript{2} sources, detectable especially in winter during the day, whereas in summer the convective upwind transport results in a strong impact of air masses with depleted CO\textsubscript{2} concentrations due to photosynthesis at lower altitudes. Plant respiration activities, which may contribute small amounts, are primarily not visible in the convective upwind air masses (which arrive at mountain sites predominantly in the afternoon). Although high elevated mountain stations do not have vegetation in their surroundings, mountain stations at lower altitudes but still in the vegetation zone may be influenced by plant respiration, especially at night.”

Page 4 line 22-24: this sentence is not clear. What do you mean by ‘which in turn in an effective tool’? What tool?

We apologize for the misleading wording. We rephrased “is an effective tool for data selection” as, “can be used for selecting representative data.”

Page 4 line 25: explain PBL and explain the changing degree of entrainment.

PBL was introduced in Section 2.1 (Page 4 line 1), as “planetary boundary layer.”

And hereby we rephrased “(e.g., due to changing degree of entrainment of PBL air)” as “because of variations in the dynamics of transport to the site (e.g., Birmili et al., 2009; Herrmann et al., 2015).”

Page 4 line 27-31: The level of English needs to be assessed particularly in these sentences.

We rephrased this part as, “…whereas in winter, significantly longer stable periods occur. In winter, no upwind air masses with depleted CO\textsubscript{2} levels due to photosynthesis of vegetation are recorded. To receive as much representative data as possible, it is desirable to select the time window dynamically. ADMV is constructed to select a subset from the measured data, being best representative for baseline conditions with an adaptive selected time window specific for every day.”

Page 5 line 7: What is the time resolution of the data sets?

The time resolution is hourly. Therefore, we added “hourly” in the sentence.

Page 5 line 11-20, and page 6 line 6-22: Revise English especially here, including use of complete sentences including articles (‘the’) and correct use of commas.
An English proofreading has been done throughout the paper.

This part is shown in the following.

**Step 1**: Detrending is done by subtracting a 3-day average for each day, including the neighboring two days. It is the shortest possible time window to remove sudden changes in the time series related to the previous and posterior days while preserving the diurnal pattern.

**Step 2**: The overall mean diurnal variation, \( \bar{d}_i \) (\( i = 0 \) to \( 23 \) h), is calculated from the complete set of detrended data.

**Step 3**: The standard deviations \( s_{\Delta j} \) from the overall mean diurnal variation \( \bar{d}_i \) are calculated on a moving window \( \Delta j \) (\( j = 6 \) h). To be able to place a full set of 24 moving time windows over the overall mean diurnal variation, time windows across midnight (e.g., 6 h from 11 p.m. to 4 a.m. LT) are also included, that is, its first \( j \) hours are appended to the end of the 24 h in the overall mean diurnal variation. The time window with the smallest standard deviation is selected as the start time window.

**Result**: The start time window \([i_{\text{start}}, ..., i_{\text{end}}]\).

Page 6 line 26: This is a vague sentence, data only exists on a single day, so why talking about selecting it in ‘any day’?

We rephrased the sentence as, “We always label the data as ‘selected’ once it has been selected by ADMV.”

Page 7 line 15: photosynthesis starts long before 11 a.m.

We rephrased “potential influences of local photosynthesis” as “transported air influenced by photosynthesis.”

Page 8 line 10: Why hourly? How did you define hourly values? As the average of the whole hour? Or just last part? Is the hour defined at the beginning of the averaging interval or at the end? This is important information and should be included in methods.

Hourly values are used because of the availability of hourly averages as the highest time resolution in the World Data Center for Greenhouse Gases (WDCGG). Therefore in order to keep the format of input data constant for ADMV method, we calculated the average of the whole hour for all data sets. The time stamp for the hourly average was defined as the beginning of the averaging interval.

Moreover, originally ADMV was developed based on 30-min time resolution at the station ZSF. Therefore ADMV method can also handle data with higher time resolution than one hour.

We added in Section 2.1, “In addition, the time stamp was defined at the beginning of the averaging interval.”

Page 8 line 15: Does it make sense to have different windows at the different levels?

The different start time windows at the different levels result automatically from the ADMV method. It always searches for the optimal start time window based on specific data sets. In our opinion, these are very interesting and valuable results, which reflect to some extent the different characteristics of different measurement sites and also different levels. In this respect, the different time windows at the different sampling levels are results of differences in the dynamics of atmospheric transport.
Page 8 line 19: The results ARE not fully comparable. Does it even make sense to analyze such a short record which does not even give a complete annual cycle?

We agree that the data were not fully comparable because the time period was too short in contrast to the other stations. However, the results showed that for time periods shorter than a full year, the ADMV method was still applicable to the data from the tower measurements, which highlights the flexibility of the approach.

Page 9 line 2: It would make sense to look at the differences by season, as the diurnal cycle is not the same throughout the year. Also, the data sets all cover different time periods, so it is difficult to compare.

We agree that there are differences in diurnal patterns among seasons. We also applied the ADMV method separated by season, i.e., data sets were processed and selected by the ADMV method only during a specific season over the whole time period. However, we found that the *start time windows* didn’t differ significantly (see Supplement S1.1).

Regarding different time periods of the sites we also included data of 2015 for SSL. Now except for HPB, all the measurement sites cover the same time period.

Page 9 line 4-10: Revise English.

The English proofreading has been done throughout the paper.

And we rephrased this paragraph as,

“With the determined *start time windows*, ADMV selected the data for all stations (see Fig. 3). In addition, we calculated the percentages of ADMV selected data values among all values of the complete datasets for all stations, which are listed in the first column of Table 2. The higher the selection percentage is the more well-mixed air is measured at the station, which is assumed to be a representation of lower free tropospheric conditions. This holds especially for IZO. Because of this the greatest amount of accepted data points with 36.2% was found at this station. The sites with intermediate percentages are JFJ (22.1%), SNB (19.3%), and ZSF (14.8%). For the three sampling heights at HPB, only 3.2% (50 m), 4.8% (93 m), and 6.2% (131 m) of the data were selected by ADMV. Finally, a similar percentage was found for SSL (4.0%), probably due to its higher data variability.”

Page 9 line 6-9: But what do these percentages actually mean? This is too descriptive and needs more analysis and perspective.

We added as mentioned above, “The higher the selection percentage is the more well-mixed air is measured at the station, which is assumed to be a representation of lower free tropospheric conditions. This holds especially for IZO. Because of this the greatest amount of accepted data points with 36.2% was found at this station.”

Page 9 line 10: what is ‘major step’ and what do the percentages by each step mean?

These different definitions of selection percentages were explained in the Supplement S3.1.

Besides, we rephrased the sentence as, “we additionally calculated selection percentages after completing both the *starting selection* and *adaptive selection* steps mentioned in Section 2.2 (see Supplement S3.1).”
Page 10 line 3: This previous section remains very descriptive. What do the differences between all methods mean, and what is more useful for what type of analysis? This needs more work.

We explained the differences of all methods and the potential reasons in the paragraph above (please see page 9 line 24–33). For ADMV method, the detailed stepwise results of selection percentages were made in Supplement S3.1. For SI and THO methods the major difference is the requirement of consecutive hours. As for MA method, the selection criteria would become too strict for stations with very small data variability (e.g., IZO).

On the other hand, this paper focuses more on the mechanism and results of ADMV method. Our intention is to give a clear and detailed instruction on this data selection method and provide options to the users. The advantage of ADMV method can be seen in the Conclusion section. To compare more thoroughly of different data selection methods and present a clear strategy of applying different methods require further researches and are beyond the focus of this paper.

Page 10 line 10: What is the use of comparing growth rates for different time periods? Growth rates are very variable from year to year, so choosing a different period gives different growth rates.

The STL technique has been re-run. The underlying time period is 2010 to 2015 for all sites except for SNB, for which data of 2010 to 2011 are missing. We changed the color for SNB to gray in Table 3 and Table 4 for differentiation.

By comparing growth rates, we aim at showing there are no significant influences on the trend components by these data selection methods.

Page 10 line 11: A positive trend in what? In the CO2 concentrations in general?

We rephrased as, “Based on the 95% confidence interval for the slope, a positive trend i.e. increasing CO2 concentrations are observed.”

Page 10 line 12: Explain VAL

VAL is validated data and thus delivered to the GAW data bases (Level 2 data). It has been explained in Section 1 (Page 2 line 12).

Page 10 line 12: what differences?

We rephrased as, “differences in the mean annual growth rates…”

Page 10 line 15: What do you mean by tendency?

What we can observe from the resulted mean annual growth rates is that, the growth rates resulted after data selection are mostly higher than the ones of validated datasets and always approaching toward the values at station IZO. However, this is not statistically significant based on the confidence intervals. That is the reason we meant by tendency.

We rephrased as, “Moreover, the following fact is observed for all sites except for SSL.”

Page 10 line 18: 2015 had a much higher growth rate compared to the years before, so that also influences the results at SSL. Why not including 2015? It is publically available through ObsPack.

Thank you very much for your suggestion. Now the CO2 data of 2015 for SSL are included
and all respective analyses have been re-run.

Page 10 section 3.3.1: I do not understand the added value of this paragraph. It should include more details on what was exactly studied and more conclusive remarks instead of only descriptive statements.

This paragraph showed the results of the trend components of all data sets at all stations. The comparison of trends based on datasets with and without data selection methods clearly indicated that mean annual growth rates were not significantly different.

To include more details, we added the following arguments in the text.

“Compared to unselected data (VAL), the mean annual growth rates based on selected data sets are systematically higher approaching the growth rates at IZO. IZO can be considered as better representing the lower free tropospheric conditions and agrees well with the mean annual absolute increase during last 10 years (2.21 ppm yr\(^{-1}\)) reported by WMO (2017a). The exception at SSL is probably is caused by stronger local influences as a result of its lower elevation. Besides, the confidence intervals of the mean annual growth rates are always smaller after data selection, which improves the precision of trends.”

Besides, we also added a general description at the beginning of the section, “The following sections discuss the resulting components obtained by STL, namely the trend component over the observation period, the seasonal component and finally the remainder component.”

Page 10 line 20: this is not clearly described (the difference between val and selected data).

As mentioned above, VAL was validated data and thus delivered to the GAW data bases, which was taken as data input for our study. Selected data were resulted data after different data selection methods.

We rephrased, “systematic differences which calculated for validated (VAL) and selected data sets…”

Page 10 line 24: this percentage is given too much precision.

We changed it to “18.9%.”

Page 10 line 27: if VAL is all validated data it can never over- or underestimate CO2 levels, as they are the actual observations!

We apologize for the misleading wording.

VAL data are validated correct measurements, adjusted to the international standard reference scales and following the Global Atmosphere Watch quality objectives. Nevertheless, due to the different time scales of transportation effects VAL data may contain values from a time period where the well mixing assumption is violated (short time events). Since we referred VAL as validated unselected measurements, the CO\(_2\) levels mentioned here refer to the background level of CO\(_2\) which are supposed to take place at the measurement sites.

If all validated data are used, this would result in an overestimation of the atmospheric CO\(_2\), due to the dominance of anthropogenic activities and no active vegetation in winter. Thus, it indicates that the VAL data are not representative.

Page 11 line 1-7: Very descriptive, add more details and analyses and perspective.
We rewrote this paragraph partly and added more content as the following.

“The magnitude of these delays may be related to mixing features in the lower free troposphere. Rapid changes are usually observed close to sources and sinks, e.g., from anthropogenic and biogenic activities. Thus, the higher the station is above the boundary layer, the later the maxima during the winter can be observed, because of the late response due to inhibited mixing conditions. However, this delay does not occur for the minima during the summer because of the very effective upward transport and more favorable mixing conditions at that time of year. Consequently, no changes in the seasonal minima are observed at all measurement sites, which is taken as an indicator of enhanced thickness of the mixing layer as good mixing conditions. Taking ZSF as an example, Birmili et al. (2009) observed low concentrations of particle number in winter and found it representative for the free tropospheric air by analyzing the annual and diurnal cycles. From spring on, the warmer it gets the higher the PBL goes. The intense vertical atmospheric exchange during summer months results in a daily air mass transport from the boundary layer to reach ZSF due to thermal convection (Reiter et al., 1986; Birmili et al., 2009). Thus there are optimal transportation and mixing conditions.”

Page 11 line 6: explain in more detail ‘thickness of the mixing layer’.
Please see the last answer above.

Page 11 line 14: what does ‘least standard deviations’ mean?
This refers to the variability in the remainder components.
Thus, we rephrased it as, “the smallest standard deviations in the remainder components.”

Page 11 line 14: we already knew that IZO is least influenced.
IZO was taken as reference station, according to our assumption at the beginning. Therefore, as the results showed the remainder component at IZO with the least standard deviation, it supported our assumption that it was the least influenced station among all.

Page 11 line 15: what are intermediate results?
We rephrased as, “The three alpine measuring stations (ZSF, SNB and JFJ) exhibit intermediate variability.”

Page 11 line 19: could, but why not done?
We deleted this sentence as it was beyond the focus of this paper.

Page 11 line 25, figure 6: why is red included in the color scale as those values do not occur? Also the caption of figure 6 contains a lot of information that should be included in the main text as well (pearson corr. matrix etc).
We changed the color scale in Figure 6 from white to blue only.
And we added the explanation of the figure in the main text, “The trend and seasonal components of all VAL and selected datasets were firstly compiled, and then Pearson’s correlation coefficients were calculated assuming normal distribution of data examined by Anderson Darling test (P < 0.05). The correlation matrices are shown for each type of data sets individually. Data used for correlation were chosen only when available at all stations (2012–2015)”.
Page 12 conclusions: should be especially checked for level of English.
An English proofreading has been done throughout the paper.

Page 12 line 1: what does this mean/imply?
We rephrased the sentence as, “The number of insignificant correlations between the station pairings is the greatest for ADMV.”
And we also added at the end of the paragraph, “This means that by ADMV, the combination of trend and seasonal components correlate best and the remaining unselected data have the lowest correlation among the methods. If these two criteria are used to separate the representative part of the data from the unrepresentative part, the ADMV method produces the best results”.

Page 12 line 7: not all 6 cover this period.
We deleted “from 2010 to 2016.”

Page 12 line 7: rewrite, ABF does not select..
We replaced by, “The ADMV selection resulted in…”

Page 12 line 8: growing elevation?
We deleted “growing.”

Page 12 line 10: but what does it mean/imply that is the most restrictive? When would you recommend the ABF method?
ADMV is the most restrictive in terms of selection percentage, which selects the least data representative for the lower free troposphere. However, additional indicators should be defined for the selection quality, such as STL and correlation analysis mentioned in the content.
Regarding the results of correlation analysis, we would recommend ADMV for selection of representative well-mixed lower free tropospheric air for the elevated mountain stations mentioned in this study.

Page 12 line 14: what do reduced and delayed mean here?
We rephrased “reduced and delayed influences of CO$_2$ sources and sinks” as, “with smaller seasonal amplitudes and delayed occurrences of seasonal maxima.”

Page 12 line 18-19: what do you mean?
We rewrote this paragraph as the following.
“The presented method ADMV is useful for data selection of atmospheric CO$_2$ data representative of the lower free troposphere. It requires only data from a single measurement site. It is easily adjustable to the local conditions and it runs automatically. The method can also be applied on historical datasets. The results provide evidence that the proposed ADMV method confers the possibility of selecting data that are representative of CO$_2$ concentrations of a larger area of the lower free troposphere. This is an elementary prerequisite for application of the method to a large number of different stations and an essential step toward generalization. It directly supports the objective of GAW to extrapolate from a set of point measurements from single
stations to a larger representative area or region in the lower free troposphere (WMO, 2017b). In future, there is a need to test whether such results could be used for additional tasks, such as ground calibration of satellite measurements”.

Page 12 line 21: how applicable is the method to other stations?

This would be one of our next research questions and would be tested in the near future.

Figure 1: add larger map to know which region of the world this is.

This was corrected.

Reference


