

Interactive comment on “Cross-validating precipitation datasets in the Indus River basin” by Jean-Philippe Baudouin et al.

Jean-Philippe Baudouin et al.

jpb88@cam.ac.uk

Received and published: 1 October 2019

1st REVIEWER

This paper presents a comprehensive assessment of several (twenty) state-of-the-art datasets for precipitation in the Upper Indus Basin region. These datasets cover different sources including station-based observational data, satellite products and re-analyses. The paper provides important and useful information on the strengths and uncertainties of the different datasets which could serve as a reference for precipitation in this area and be used for validation purposes. However, in order to be really of use,

[Printer-friendly version](#)

[Discussion paper](#)



the paper requires some revisions. Some sentences are hard to be read and should be rephrased or better explained. Some grammatical errors need to be fixed. I think that the paper deserves publication in this journal only after the comments/requests listed below are carefully addressed.

General comments/questions:

1) Is it possible from the analysis presented in the paper to really identify the best and/or the worst performing dataset, though a possible dataset "rank" probably depends on the variable/process one is looking at? The authors present advantages, disadvantages and strengths of the various datasets but the main message which remains to the reader, I think, is that many uncertainties remain. The conclusion, as it is, is not really "positive". What is the main message that the authors want to convey?

Reply: In this study, the analysis of the quality of each dataset is limited to the precipitation in the Indus basin. We do not make presumptions about the quality of the datasets in other areas, nor other variables for the reanalyses. We have removed the term "rank" , particularly when performing the cross-correlation analysis (Section 3.3.2) as the reader may understand it in an absolute sense. We instead specify which datasets perform best for which measures.

Nevertheless, we can infer that, for example, reanalyses that represent the precipitation in the Indus basin better also represent circulation patterns and the processes involved in the generation of precipitation better.

Lastly, we specifically reorganised the conclusion around the key messages we want to convey. These are as follows:

- The method we have used gives detailed information on the strengths and

limitations of each of the 20 datasets investigated.

- There are large uncertainties, especially if considering all datasets equally. However, by evaluating the strengths and limitations of each dataset, we have found that some stand out as being of much higher quality which eventually helps to reduce the uncertainty.
- Particularly, progress in reanalysis products is real, with one (ERA5) scoring as high as the observations for all measures. These reanalyses offer a different point of view than the observations, which is useful for estimating the uncertainty, and can even be used to some extent to validate observations.
- We also emphasise on the need to systematically adjust rain gauge measurements to account for precipitation undercatchment.

TEXT MODIFIED

- For changes in Section 3.3.2 on cross-validation of Daily variability, which was part of Section 3.2 Daily variability in the reviewed document, see answer to general comment 8 of the first reviewer
- Changes in the Conclusion are shown below in bold:

"In this study, we have compared a large number of precipitation datasets of different types across two distinct zones of the Indus watershed: six datasets are based only on rain gauges, four are derived from satellite observations, and ten from reanalysis. We

have shown that the number and diversity of the datasets help to identify and quantify the limitations and abilities of each of them, which in turn enables a better estimation of the **uncertainty**.

We have compared the datasets on the basis of annual mean precipitation, the seasonal cycle, as well as the variability over time scales from one day to 10 years. We have relied on the literature to evaluate the different sources of uncertainty and have interpreted the mean differences between datasets in terms of their quality. By contrast, we have suggested that the similarities in variability can directly be interpreted in terms of quality, especially when comparing datasets with no common methods or data source. Most reanalyses do not assimilate precipitation observations, which makes it possible to cross-validate between observational and reanalysis data based on variability. Regardless of the observational datasets used as a reference, we have found that some reanalyses have significantly higher correlation with that reference than other reanalyses, which we have interpreted as a sign of good quality. Conversely, when using a reanalysis as a reference, some observational datasets have significantly higher correlation than others. The use of reanalyses to validate observational datasets is justified by the quality of reanalysis products demonstrated in this study. Specifically, at the scale of the Indus basin, and for the daily variability, the same level of similarity between the reanalyses and observations is also seen between the observational datasets themselves.

We have used the Pearson correlation to compare the datasets, although it has some limitations. For example, it is affected by extreme values, that is, in our context, abnormally large precipitation events. These lead to some difficulties in interpreting trends and we preferred the Spearman formula in this context (cf. Figures 6 and 7). By contrast, the Pearson correlation is less affected by the

difficulties in representing the lowest precipitation rates, although these rates can explain some of the biases.

One of our findings concerns the important uncertainty in fine scale spatial patterns of precipitation, particularly in the upper Indus, where precipitation is the most heterogeneous. Important discrepancies remain between datasets, which explain part of the differences in mean precipitation. This issue needs to be tackled in observational datasets by including more measurements and by updating the climatology used in the interpolation methods. In reanalysis products, higher resolution and better modelling of the small scale processes are likely needed to improve confidence in the spatial pattern of precipitation. In this study, we have deliberately selected two large study areas, which has increased the confidence in the datasets. Area-wide correlation particularly improves the significance of the variability analysis, compared to a point-wise correlation.

We have also found that the quality of the datasets depends on the season. Rain gauge measurements suffer from important underestimations in winter for the upper Indus. Most satellite-derived datasets even further amplify this bias. By contrast, reanalyses perform best during winter. Particularly, the most recent reanalyses produce a very similar amount of winter precipitation and its variability is similar to the observations at all timescales. We have suggested that this amount of precipitation is closer to reality than the observations, although some overestimations are possible, due to, for example, misrepresentation of the lowest precipitation rates. Summer precipitation, in both study areas, is much more uncertain in the reanalyses in total amount, seasonality, and variability. In contrast, satellite observations perform better in summer than in winter and seem to bring additional information to rain gauge measurements.

As mentioned above, rain gauge-based datasets underestimate precipitation. Only GPCP products use a correction factor to account for measurement underestimation, but this factor is still too small. We emphasise the need to correct directly the measured values before interpolation to a grid dataset, using, for example, methods similar to those developed by Dahri et al. (2018).

More specifically, APHRODITE is the best **observational** dataset for daily and monthly variability, thanks to a large number of observations in the whole basin. However, it also exhibits drier conditions than most of the other datasets, which is partially caused by the interpolation method it uses and possibly by a lower quality of the data. Surprisingly, APHRODITE-2 is not as good, especially for the longer term variability, as it removes some observations in areas with an already lower density of measurements. **CPC is the least reliable observational dataset, particularly for the upper Indus, with a large dry bias compared to GPCP-monthly, the lowest correlation scores at all time scale, and an error on the dates before 1998. However, its quality significantly improves after 2005, which, we suspect, is due to a change in the quality of the data source.** GPCP-monthly is one of the most reliable datasets **both in terms of amount and variability. GPCP-daily relies on GPCP-monthly for its monthly mean. The very low number of daily measurements included in the early part of the covered period limits its quality, but this quickly improves as more observations are included.**

Satellite-based datasets are very dependent on the quality of the rain-gauge product they integrate. The added-value of satellite observations remains limited at the basin scale. **The signal is degraded during winter for the upper Indus, while better results in the lower Indus suggest slightly wetter conditions than the rain gauge-based datasets. Importantly, the quality of satellite-based datasets resides in their near real time availability as well as their higher temporal and spatial reso-**

[Printer-friendly version](#)[Discussion paper](#)

lution than rain gauge based datasets.

The quality of reanalysis datasets has clearly improved since the first datasets were released. ERA5 is the latest reanalysis and clearly stands out as the one representing best the observations, in terms of amount, seasonality, and variability at all time scales investigated. Remarkably, it is the only reanalysis representing the decadal variability of the summer precipitation that is seen in the observations in both study areas. Furthermore, for the daily to inter-annual variability, the best performing observational dataset has often a better level of similarity with ERA5 than with other observational datasets. Some of these qualities can be derived from its high resolution, which allows the representation of interesting fine scale features, as well as the assimilation of precipitation measurements.

After ERA5, ERA-Interim, MERRA1 and MERRA2 have relatively similar performance. Reichle et al. (2017) showed that the soil moisture content was not improved over South Asia from MERRA1 to MERRA2, neither in terms of variability nor biases, despite the use of CPC to correct the precipitation input to the land surface model of MERRA2. Given the difficulties of CPC to represent precipitation in the Indus basin, correcting the modelled precipitation with this dataset probably does not improve the signal. In this study, we were able to show that the correction with CPC feeds back locally on the modelled precipitation, particularly at the monthly scale for the upper Indus. We have also suggested that the dry bias of MERRA2 in the lower Indus, and the decreased score on the daily variability compared to MERRA1, is also due to that correction.

The confidence in JRA's precipitation in the upper Indus is generally high, but

drops for the daily and monthly variability in the 1990s. By contrast, it represents overly wet conditions for the lower Indus. CFSR has problems reproducing the daily variability and the seasonality of the monsoon, especially in the upper Indus. This is probably improved by the latest version that started in April 2011. However, it would likely be better to treat the two versions separately as it seems the new version produces somewhat different statistics of precipitation. The twentieth century reanalyses, **which includes** only surface **observations**, are not as good as the others, especially in winter. However, while 20CR barely reproduces any of the variability depicted by the observation, ERA-20C has much better capabilities, close to NCEP1 and CFSR, especially during summer. Neither 20CR nor ERA-20C represent the decadal variability as shown by the observation before 1980.

Finally, large uncertainties remain about precipitation in the upper Indus, but one should not treat all datasets equally. We have demonstrated that specific datasets represent the precipitation better, which helps to narrow down the uncertainty. Particularly, we have argued that reanalyses and observational datasets can both be useful for cross-validation. They can also be used for quality monitoring. Daily correlation of precipitation for key areas can be performed between a series of datasets with near real time updates. Changes in correlation between one or several datasets would therefore highlight a change in quality that would need to be investigated."

[Printer-friendly version](#)

[Discussion paper](#)



2) *Given the analysis presented in the paper, do the authors think that using the average of all datasets (a multi-dataset mean) could be a further output to be provided, along with the individual datasets themselves? I suggest to add the mean of all observation-based datasets, and of all reanalysis dataset indeed.*

Answer: analysing a multi-dataset mean does not provide more information about the quality of the datasets considered, and is therefore slightly outside the scope of the study. Such a mean is often used when uncertainties are very large and a best dataset cannot be selected (e.g. a multi-model mean for future simulation of the climate). In our study, however, we found that both APHRODITE and GPCC-monthly for the observation and ERA5 for the reanalyses were performing significantly better than other datasets. Furthermore, all datasets covered different periods, which complicates the use of a mean in practical situations.

Nevertheless, we checked if a mean can bring better results in terms of daily variability for the period 1998-2007. We considered the mean of the 6 observational datasets available at daily resolution, as well as the mean of ERA5, JRA, MERRA2 and CFSR (which are the most recent reanalyses). The correlation of these means against a reference are higher than that of most of the datasets composing them. However, the best datasets still have better scores. There is one exception in the lower Indus, as the mean of the observations performs significantly better than any of the individual observational datasets. In that domain, all observational datasets have very similar scores, and the mean is able to further improve these scores. These results seem to be too specific to be included in the study.

Printer-friendly version

Discussion paper



3) *One of the findings of the paper, which corroborates previous studies, is the fact that precipitation estimates from rain gauges are underestimated. The last sentence of the abstract highlights the need to account for this bias. Is it possible/reasonable, based on the study and results presented in the paper, to suggest "correction factors" to be applied to rain gauge estimates for the study area?*

Answer: This study does not evaluate the underestimation of rain gauge measurements, but rather suggests that this underestimation is the main cause of the differences between reanalyses and observations. Precipitation estimates from reanalyses are likely closer to the real amounts, but they may also be overestimated, and we cannot quantify this with our method. We rather urge a systematic correction of rain gauge measurements, using similar techniques as was used by Dahri et al. (2018), as this seems to be the best way to evaluate underestimations.

TEXT MODIFIED

See 6th paragraph of the updated conclusion in answer to general comment 1 of 1st reviewer

[Printer-friendly version](#)

[Discussion paper](#)



4) *In the description of the domain of study (section 2.1), it would be nice to have information on the average elevation of the two study domains and the range of elevations at least in the upper Indus.*

Answer: We added a new figure that gives the elevation, as suggested in comment 3 of the 2nd reviewer. It is used to introduce the domain of study.

TEXT MODIFIED:

- caption to figure 1 (See figure at the end):

"Relief and topographical features in and around the area investigated. The thick outer black contour represent the watershed on the Indus and Luni rivers. This area is split to form the two study areas: the upper Indus to the north, and the lower Indus to the south."

- At the start of section 2.1 "Study areas" , we have added (in bold):

"The Indus River basin extends across the north-westernmost part of the South Asian sub-continent, and is an area of various topographic features, as indicated in figure 1."

Printer-friendly version

Discussion paper



5) *I have some concerns about the methodology used to interpolate the different datasets at the same spatial resolution. Is bilinear interpolation correct when dealing with precipitation fields? Wouldn't be preferable to use a more conservative approach? Did the authors test other approaches?*

Answer: All rain-gauge datasets are based on a bi-linear interpolation of the station measurements, which justify the use of a bi-linear interpolation here. The only difference is that it is not the direct measurements that are interpolated in these observational datasets, but its anomaly against a climatology. However, using a specific climatology here would bias the validation.

Another, more conservative approach is to select the grid points whose centre is within the area of study. However, this would lead to small changes on the area being considered and precipitation biases. These biases are partly eliminated by the bi-linear interpolation.

TEXT MODIFIED

- The whole of Section 2.3 Methods has been updated in light of other comments. The changes are in bold, the one considering this specific comment are in the first paragraph:

"For each dataset, the time series of precipitation **are** averaged over the two **study areas (upper and lower Indus) and** calculated at a monthly resolution, and daily if possible. **The datasets have different spatial resolution which causes a problem when calculating the precipitation averages over the study areas. Simply selecting the cells whose centre is within these areas leads to small biases in the extent of the region considered. These biases are reduced by bi-linearly in-**

[Printer-friendly version](#)

[Discussion paper](#)



terpolating all data to a 0.25° grid, common to APHRODITE, APHRODITE-2, and GPCP-monthly. This choice is further discussed in section 3.1.1."

The analysis is performed over the 10-year period from 1998-2007, which is common to all datasets, **except when analysing the trends and inter-annual to decadal variability, for which we use all data available. We focus on the two wet seasons of the upper Indus.** Summer is defined from June to September, which matches the monsoon precipitation peak. Winter is defined from December to March. This fits the snowfall peak rather than the precipitation peak, but makes it possible to focus on issues of snowfall estimation (Palazzi et al. 2013). **In the lower Indus, we use the same definition of summer, but winter is not analysed, as it is a dry season.**

We first compare the mean and seasonal cycle of each dataset in sections 3.1 and 3.2. There, for illustrative purposes, we make quantitative statements using GPCP-monthly as a reference. However, in section 3.1.3, we use the precipitation dataset from Dahri et al. (2018) as reference instead. This dataset cannot be used in other parts of the study, as it is limited to one part of the upper Indus, and only provides annual means.

Then, in section 3.3 we compare the daily variability of the precipitation using the Pearson correlation. The correlation significance is discussed at the 95% probability level. To reduce the impact of abnormally large rainfall events when investigating the trend (cf. Section 3.3.4), we use the Spearman correlation. Lastly, in section 3.4, other time scales of variability of the precipitation are investigated: monthly, seasonal, inter-annual, and decadal, still using the Pearson correlation at the 95% confidence interval."

- We also added a paragraph at the start of the Result section, on the differences of annual mean precipitation among rain gauges datasets (3.1.1), just after the introduction of the figures (cf. answer on comment 8 of the first reviewer)

6) In the section "Methods" , the authors say that the comparison among the different datasets is performed in terms of mean and variability. What do they mean with "variability" ? Is that year-to-year variability? Daily? Something else? This must be better specified in the Methods before going to the Results section.

Answer: the different time scales investigated are presented one paragraph above in that section, which led to some confusion for the readers. This has been corrected in the updated methodology (cf. Answer to the general comment 5 of the first reviewer).

7) The discussion of Figure 2 (for the observation-based datasets, both in-situ and satellite), though containing many elements and considerations is, in my opinion, slightly confused. One reason is that the authors do not state in a very clear way that, e.g., they are taking one dataset as the reference (GPCC-monthly) against which to compare the other datasets. I agree that one reference is used, but this should be clearly stated (for example already in the "Methods" section)

Answer: We added information about the use of references in the method section. We have also clarified in which part of the result sections which reference is used. Lastly, the discussion of figure 2 (now figure 3) on seasonality is performed differently and focuses only on seasonality and not on annual mean differences.

TEXT MODIFIED

- 3rd paragraph of the reviewed Method section (cf. Answer to the general comment 5 of the first reviewer)

[Printer-friendly version](#)

[Discussion paper](#)



- The figure 3 on seasonality is discussed in a specific section (3.2, see answer to general comment 8 of the first reviewer)

8) Each subsection of the "Results" section is very long (especially 3.1 and 3.2) and there is a risk that the reader gets "lost", in combination to the fact that there is a lot of information delivered. I suggest to try reducing these subsections a little bit and make it clear what the final message to the reader is. For example, one confusing thing, at least for me, is that on the one hand the "reference" dataset against which the other products are compared is GPCC-monthly (if I understood well), while, on the other hand, another cited paper (Dahri2018) is taken as a reference (long discussion in Section 3.1).

Answer: As suggested by the second reviewer, we split section 3.1 and 3.2 into several subsections (See comment 11 of the second reviewer).

The headings are now:

3.1 Annual mean

3.1.1 Differences between rain gauges-based datasets

3.1.2 Considering satellite and reanalysis datasets

3.1.3 Impact of rain gauge biases in mountainous terrains

3.2 Seasonal cycle

3.3 Daily variability

3.3.1 Lag analysis

3.3.2 Cross-validation

[Printer-friendly version](#)

[Discussion paper](#)



3.3.3 Influence of the seasonality

3.3.4 Trends

We particularly disentangled the analysis of the differences in annual mean on one hand, and the seasonal and monthly mean on the other. This improves the discussion of figure 3 on seasonality (cf general comment 7 and specific comment on Page 14, Line 27 of the first reviewer). We also put the comparison with Darhi et al. 2018 results in a specific subsection. Lastly, we deleted some redundant text.

TEXT MODIFIED

- We mention the use of Dahri et al. 2018 as a reference in the method section (cf. answer to general comment 5 of the first reviewer)
- New section 3.1 and 3.2 are now as follow, with the changes in bold:

''

3. Results

3.1 Annual mean

3.1.1 Differences among rain gauges-based datasets

Annual mean precipitation in both domains and for each dataset are given in Table 4 (last two columns). We first focus on the rain gauge-based datasets

Printer-friendly version

Discussion paper



(upper part of the table). Spatial pattern differences are shown in Figure 2-A to E.

First, we should mention that the bi-linear method we use to interpolate each dataset to the same grid (cf. Subsection 2.3) leads to some differences between datasets. The two GPCC products can be used to evaluate the impact of our interpolation method, as they have a different spatial resolution but are based on the same climatology. Hence, the small underestimation of GPCC-daily compared to GPCC-monthly (about 1% in the upper Indus and 5% in the lower Indus) should be related to the interpolation method. However, these differences are small enough to justify the use of our method.

More generally, annual mean differences can be explained by methods and data that each dataset uses. Particularly, the interpolation of station measurements to a grid differs from one dataset to the other. APHRODITE's interpolation method, for instance, considers the orientation of the slope to quantify the influence of nearby stations. This greatly reduces the amount of precipitation falling in the inner mountains compared to GPCC-monthly. An example of this pattern is evident to the North of the Himalayas where only very few observations exist (Figure 2-D; Yatagai et al. (2012). In CRU, the interpolation method (triangulated linear interpolation of anomalies; Harris et al. (2014) seems to smooth areas of strong gradients such as near the foothills of the Himalayas (Figure 2-B). This smoothing might explain a slightly drier upper Indus, and slightly wetter lower Indus, compared to GPCC-monthly (Table 4).

Differences can also be explained by the dramatic change in location and number of stations used to compute the statistics (Figure 2-A, C, D, and E, Table 2). For example, CPC is by far the driest dataset in the upper Indus and the second driest in the lower Indus. This is likely related to the low number of observations it includes, leaving vast areas with no or very few observations, including the

[Printer-friendly version](#)[Discussion paper](#)

wettest regions (Figure 2-E). However, there is no linear **relationship** between precipitation **amount** and number of observations. GPCC-daily includes the lowest number of observations, **but this does not impact its climatology, because the climatology is derived from GPCC-monthly**. On the contrary, APHRODITE **comprises** a much higher number of observations than other datasets, but remains much drier than GPCC-monthly (**about 20% drier in both study areas**).

Yatagai et al. (2012) pointed out that differences in quality checks compared to the other datasets might explain APHRODITE's **dry bias**. **They noted that APHRODITE partly** relies on GTS data that are sent in near real time to the global network, **with the risk of misreporting. This risk particularly concerns misreported zero values, which are hard to detect and lead to a dry bias. The large dry bias seen in CPC data might be associated to the same issue, since CPC is entirely based on GTS data**. In GPCC-monthly (and daily), only stations with at least 70% of data per month are retained (Schneider et al 2014), while in CRU this number is 75% (Harris et al, 2014). Thus, limiting the analysis to the most reliable weather stations can help build confidence in recorded total precipitation amount.

Interestingly, APHRODITE-2 is **more than 10% wetter** than APHRODITE **in both study areas**. Several changes have been performed in the methodology: quality control of extreme high values, station-value conservation after interpolation, merging daily observation with different definitions of **End of Day time (cf. Section 3.1.1)**, and an updated climatology. However, the difference in mean precipitation is **most likely** related to the change in observations from rain gauges. **Although APHRODITE-2 comprises more observations basin-wide**, this increase mainly occurs over the Indian territory, whereas Pakistan is presented with fewer precipitation measurements, especially in the dry southern central part (Figure 2-D). This decrease in observations in a drier area can reasonably explain the increase in mean precipitation in the lower Indus. In

[Printer-friendly version](#)

[Discussion paper](#)



the upper Indus, the increase is mainly due to the inclusion of measurements from one isolated weather station in the northernmost part of **the area**.

3.1.2 Considering the other datasets

We now consider satellite-based datasets (middle part of the table 4). In the upper Indus, CMAP stands out as being the wettest observational datasets, 13% wetter than GPCC-monthly. By contrast, the other three (TMPA, GPCC-1DD, GPCP-SG), are drier than GPCC-monthly (between 10 and 5%), despite being calibrated by this GPCC-monthly. In the lower Indus, all satellite-derived datasets are wetter than the rain gauge products (between 10 and 30% more than GPCC-monthly). The complexity of the algorithm used to produce the satellite-based datasets makes determining the reasons for their differences with each other or with rain gauge products difficult. According to previous studies, their ability to represent precipitation over rough terrain is limited (e.g. Hussain et al. (2017)). **In fact, figure 2-F shows that the strongest differences between TMPA and GPCC-monthly occurs near mountain ranges, such as the upper Indus.** In contrast, precipitation estimates over flat terrain with sparse observations and mostly convective precipitation benefit from satellite observations (Ebert et al. 2007). This suggests that **the** higher precipitation mean of the satellite-derived datasets for the lower Indus is possibly due to better consideration of locally higher precipitation rates during convective events.

The annual mean precipitation in reanalysis datasets is listed in the lower part of table 4. In the lower Indus, the range of values is very high: the wettest dataset, JRA, is five times wetter than the driest dataset, 20CR. This range shows the significant difficulties for reanalyses to represent precipitation in an area

were convection dominates. Among the most recent reanalyses, ERA5 has the closest precipitation estimates to the observational datasets, yet above the estimates from rain gauges. Figure 2-H suggests that these wetter conditions mainly comes from the north-western edge of the Suleiman range, an area with sparse precipitation observation (cf. Figure 2-A), therefore increasing confidence in ERA5 estimation. The two twentieth century reanalysis (20CR and ERA-20C) are amongst the driest reanalysis datasets, suggesting that their models have difficulties to propagate the monsoon precipitation into the lower Indus region, when only surface observations are assimilated. Lastly, MERRA2 exhibits a severe drop of precipitation compared to the previous version, MERRA1. Summer monsoon precipitation is known to be strongly affected by surface moisture content, especially in flat areas like the lower Indus (Douville et al. 2001). MERRA2 uses CPC data to constrain the precipitation flux at the surface. Due to the dry bias of CPC, soil moisture is reduced for most of India (Figure 3 in Reichle et al. 2017), explaining the drop in precipitation.

For the upper Indus, the most striking features is that all reanalysis datasets except MERRA1 and ERA-20C predict higher precipitation amounts than GPCP-monthly, about 20% higher on average. In the following we investigate whether this difference can be explained by an underestimation of rain gauge measurements.

3.1.3 Impact of rain gauge biases in mountainous terrains

Rain gauge measurements are known to potentially underestimate precipitation and particularly snowfall (Sevruk et al. 1984, Goodison et al. 1989). This is an

[Printer-friendly version](#)[Discussion paper](#)

important issue for mountainous regions such as the upper Indus. However, among the six rain gauge-based datasets, only GPCC's products consider a correction of the data. Based on a study by Legates et al (1990), a correction factor, which depends on the month, is applied at each grid cell. Most of these factors vary between 5 and 10% (Figure 4 in Schneider et al. 2014), and explain why GPCC's products are wetter than most of the other rain gauge-based datasets. Recently, Dahri et al. (2018, hereafter Dahri2018) compiled the measurements from over 270 rain gauges in the upper Indus and adjusted their **values** to undercatchment, following WMO guidelines. They found a basin-wide adjustment of 21% , but this varies from 65% for high altitude stations, to around 1% for the stations in the plains.

The Dahri2018 dataset has both the advantage of considering a very large number of observations and correcting rain gauge measurements. However, its result is based on a study area somewhat smaller than the upper Indus **region** presented here, and only covers the period from 1999 to 2011. **For comparison purpose,** we recomputed the annual mean of several of the most recent and highest resolution datasets to fit these definitions (Table 5).

Table 5 shows that none of the observational datasets is able to reproduce the Dahri2018 precipitation estimates. They all have a dry bias, from 30% for TMPA, to 10% for GPCC-monthly. Furthermore, APHRODITE-2 and TMPA even underestimate the unadjusted value of Dahri2018, which suggests that the underestimation is not only related to rain gauge measurements, but also to the representation of the spatial pattern. By contrast, GPCC-monthly is 7% higher than the Dahri2018 unadjusted values, which corresponds to the correction factor used in GPCC. This suggests that the unadjusted values in both datasets are very close, and highlights quality of GPCC. Nevertheless, we also found discrepancies in the

[Printer-friendly version](#)[Discussion paper](#)

spatial patterns between GPCP-monthly and Dahri2018. Particularly, in the northern-most part of the upper Indus **region**, in the Karakoram range, GPCP-monthly exhibits lower precipitation means than Dahri2018, which cannot be explained by the difference in **correction factors** between the two datasets alone. The nearest stations used in GPCP-monthly are all located in the dry and more accessible Indus River valley to the south of the mountain range (Figure 2-A). Those drier conditions extend to the north due to the interpolation method used by GPCP, while Dahri2018 includes station measurements with wetter conditions than in the valley. This difference illustrates the impact of biased weather station locations mentioned in the introduction and in several other studies (e.g. Archer and Fowler, 2004; Ménégoz et al., 2013; Immerzeel et al., 2015).

Still in the Karakoram range, figures 2-G and E show that MERRA2 and ERA5 are wetter than GPCP-monthly, and therefore closer to Dahri2018. However, spatial discrepancies remain. Particularly, the maximum of precipitation in MERRA2 is shifted to the North, which leads to important biases when averaging on the Dahri2018's study area. Our domain of study, which does not overlap with the highest precipitation rates, is less affected by shifts and is better fitted to compare the large scale precipitation patterns. Nevertheless, the four selected re-analysis datasets in Table 5 overestimate the Dahri2018 adjusted values, by 20% on average. This suggests that part but not all of the differences between re-analysis and observational data can be explained by biases from the latter. This overestimation of modelled precipitation in reanalyses for the upper Indus is corroborated by previous studies (e.g. Palazzi et al., 2015).

To conclude, all rain gauge-based datasets suffer from **an underestimation of annual mean precipitation for the upper Indus when compared to Darhi2018. This results from biases in rain gauge locations and measurements.** Quality control and

[Printer-friendly version](#)[Discussion paper](#)

interpolation **methods** also impact **precipitation amount in** both parts of the basin. Satellite observations probably improve precipitation estimates in flat areas with sparse observations. However, **they** cannot correct observational biases since they use them for calibration, and biases remain unchanged **or even amplify** for the upper Indus. **Re-analyses do not include rain gauge measurement**, except for ERA5 and MERRA2, and are therefore not affected by observational **biases**. **However, model biases can also be significant as suggested by the spread of the annual mean precipitation values. Reanalyses tend to be wetter than observational datasets in the upper Indus, which is partly explained by the underestimation of the observations. Lastly, all datasets suffer from spatial discrepancies, which are detrimental to small-scale comparisons, especially near mountains, but justify our choice to use a larger study area.**

3.2 Seasonal cycle

The seasonal cycle of precipitation for each dataset is presented in Figure 3. Analysing the seasonality is particularly interesting in the upper Indus, as it is characterised by two wet seasons. The mean precipitation of each season is presented in table 4 (second and third column). The rain gauge-based datasets exhibit a very similar seasonality for both study areas. In the upper Indus, the maxima of precipitation occur in February and July, the minima in May and November. The differences between the datasets vary little from one month to another, which suggests that the causes of the differences identified in the previous section (e.g. misreporting, station location and number, interpolation method) are independent of the seasonality. The satellite-based datasets represent the summer precipitation almost exactly as GPCC-monthly. The annual mean differences are explained by biases during the winter season, which suggests that winter

[Printer-friendly version](#)[Discussion paper](#)

precipitation is more difficult to estimate for those datasets.

The reanalyses represent the dry and wet seasons of the upper Indus, but with a larger spread than in the observations and some differences in seasonal cycle (Figure 3-B). On average, winter precipitation is 30% higher than in GPCC-monthly, with the notable exception of ERA-20C (Table 4). Those wetter conditions also extend to the surrounding drier months: April/May and October/November. **However**, the mean summer precipitation in reanalyses is not significantly **different from** GPCC-monthly (Table 4). Only ERA-Interim stands out with a wet summer precipitation bias, mainly in the north-west corner of the upper Indus domain, a bias partly corrected in ERA5 (Figure 2-H). **The winter wet bias is not surprising after the comparison with the Dahri2018 dataset in the section 3.1.3. Indeed, Dahri2018 found that the most important rain gauge underestimations happen in winter when precipitation mostly falls as snow. More interestingly, we found that the latest reanalyses (ERA5, JRA, MERRA2, and CFSR) represent winter precipitation in similar ways. We haven't been able to investigate the seasonality of the Dahri2018 dataset, but we suggest that the latest reanalyses better represent winter precipitation than the observational datasets.**

We noted another discrepancy in seasonality between a majority of the reanalyses and the observations for the upper Indus: a delay of the summer precipitation starting from the pre-monsoon season (Figure 3-B). The observations show that May is the driest month of that season followed by a sharp increase in precipitation in June. Only ERA5, ERA25 Interim, and MERRA1 reproduce this behaviour. In contrast, NCEP2 and CFSR are much drier in June than in May. For other reanalyses, precipitation during May and June are comparable. This delay continues into the summer monsoon period: while the observations clearly show a wetter July than August, this is only the case for ERA5, ERA-Interim, and both MERRA reanalyses. A similar delay

can be found over the Ganges plain and along the Himalayas, which suggests wider uncertainties on the monsoon propagation in the reanalyses. **By contrast, no such delay is found in the lower Indus, despite the large uncertainty on the amount of precipitation (Figure 3-D)**

HESSD

[Interactive
comment](#)

[Printer-friendly version](#)

[Discussion paper](#)



9) *Tables and Figures are not (always) correctly introduced in the text. In my opinion, when a figure/table is cited, it should be briefly described to say what it shows/displays (leaving the technical details to the caption and legend). Also check all Figures and Tables captions.*

Answer: we added or changed the sentences that introduce each figures before discussing them, if this was not done properly

TEXT MODIFIED:

- **Figure 1:** "The Indus River basin extends across the north-westernmost part of the South Asian sub-continent, **an area of various topographic features, as represented in figure 1.**"
- **Figure 2:** "**Precipitation amount varies across the basin as shown in Figure 2-A.**"
- **Table 1 and 2:** "We have selected five commonly used and one newly available gridded dataset based only on rain gauge data. **These are the first six datasets presented** in Table 1. **The mean number of stations used in the two study areas are available for five of the datasets and presented in Table 2.**"
- **Table 3:** "**Table 3 shows the ensemble of the ten reanalysis datasets that have been used in this study.**"
- **Table 4 and rest of Figure 2:** "**Annual mean of precipitation in both domains and for each dataset are given in Table 4 (last two columns). We first focus on the rain gauge-based datasets (upper part of the table). We found an important range of values in both study areas, which are related to dis-**

[Printer-friendly version](#)[Discussion paper](#)

crepancies in the precipitation spatial pattern as presented in Figure 2-A to E."

- **Figure 3:** "The seasonal cycle of precipitation for each datasets is presented in figure 3."
- **Table 6:** "Table 6 presents the daily correlation of precipitation between the different datasets, for the upper Indus. The upper part of the table focuses on the cross-correlation between the observational datasets."
- **Table 7:** "The same correlation analysis is performed for the lower Indus domain (Table 7)."
- **Figure 5:** "Figure 5 presents the seasonality, for the upper Indus, of the correlations between the reanalyses and APHRODITE-2."

[Printer-friendly version](#)

[Discussion paper](#)



10) Words like "consistency" or "consistent" are often used but I think that they are too generic. Please try to find other ways to convey the message.

Answer: We have found 3 occurrences of the words "consistent" and "consistency" . The first disappeared during the transformation of the first result section. In the other two cases, it had a meaning of stability.

TEXT MODIFIED

- "Correlations between JRA and APHRODITE remains mostly between 0.8 and 0.85. ERA-20C is also **fairly stable** over time, generally above NCEP1. 20CR, by contrast, exhibits a much higher variability with correlation dropping as low as 0.4 at times, and sometimes reaching NCEP1"
- "We found **relatively stable correlations** with APHRODITE and CRU during the twentieth century"

Printer-friendly version

Discussion paper



11) *I'm not completely comfortable with the message that the reanalyses are useful to validate observations (as stated for example in the Conclusions). To be better discussed.*

Answer: This is one of the key messages of the conclusion and is further discussed there (cf. answer to comment 1 of the 1st reviewer). In essence, both reanalysis and gridded observational data are estimates of the actual precipitation. Reanalyses rely the understanding of processes and a large ensemble of observations, while observational datasets only rely on precipitation measurements in specific locations. Their difference of approach makes them differently dependent on different sources of uncertainty, which allow a cross-validation. Importantly, the cross-validation is limited in our study to the precipitation variability at daily and monthly time scale and at the scale of the study areas. It is justified by the fact the most recent reanalyses represent variability within the range of uncertainty given by the different observational datasets. That is, these reanalyses represent the daily and monthly variability of the precipitation at least as well as the observational datasets.

Validation of the amount of precipitation is more complicated and needs a thorough understanding of the source of uncertainty in each dataset. Furthermore, we do not assume that the validation can be performed for other variables.

[Printer-friendly version](#)

[Discussion paper](#)



Specific Comments:

Abstract

Page 1, Lines 3-4: In my opinion, the sentence "While rain gauge ... underestimation" would need to be rephrased. I would add a comma (,) after the word "reference" and I would change the subsequent sentence as follows, ", they provide information for specific, often sparse, locations (point observations) and are subject to underestimation in mountain areas", rather than "they are only punctual [...]"

Answer: Agreed, changed as suggested.

Page 1, Line 5: Add "data" after "reanalysis"

Answer: added

Page 1, Line 10: Please replace "most able" with "most performing", or similar

Answer: we further clarified the sentence to "ERA5 is the reanalysis that offers estimates of precipitation closest to observations, "

Page 1, Line 14: I don't understand whether "small" refers to "correction" ; also, the term "correction" should be better explained. Please try to rephrase this sentence, if possible

Answer: "Correction" corresponds here to a factor by which the raw value are multiplied. "small" refers to that factor. We added the term "factor" twice in the sentence:

"GPCP products are the only datasets that include a correction **factor** of the rain gauge

Printer-friendly version

Discussion paper



measurements but **this factor** remains likely too small"

Introduction

Page 2, Line 13: Add "of" between "use" and "rain gauges"

Answer: added

Page 3, Line 1: 900km² → 900 km²

Page 3, Line 2: 250 km² → 250 km²

Page 3, Line 3: 15,000 km² → 15,000 km²

Page 3, Line 7: 500 km² → 500 km²

Answer: "2" is now a superscript.

Page 3, Line 14: Add "the" between "and" and "heterogeneity"

Answer: added

Page 3, Line 17: Remove "a" between "over" and "flat"

Answer: removed

Page 3, Line 18: Replace "those" at the end of the sentence with "station data"

Answer: replaced

[Printer-friendly version](#)

[Discussion paper](#)



Page 3, Line 21: Replace "case" with "cases"

Answer: replaced

Page 3, Line 23: Replace "consider" with "highlight" ; "reanalysis" with "reanalyses" and "observation" with "observations"

Answer: all replaced

Page 3, Line 25: Please change "has it made possible" with "has made it possible"

Answer: changed

Page 3, Line 26: Add "product" after "reanalysis"

Answer: added

Page 3, Lines 28-30: I would remove the sentence starting with "Specifically" and ending with "variability" . These are like results and conclusions of the study which is going to be presented, not useful here.

Answer: Agreed, deleted.

Page 3, Line 30: Please replace "qualities" with e.g. "strengths and limitations"

Answer: changed as suggested

Page 3, Line 31: Please replace "have" with "has"

Answer: replaced

Page 3, Line 34: Please replace "method" with "methods"

Answer: replaced

Page 4, I would specify somewhere that the analyses described in items i), ii), and iii) concern precipitation. For example, "[...] which review the precipitation i) seasonal cycle [...], ii) daily variability [...], and iii) monthly and longer term [...]" . Moreover, I would expect another sentence at the end of the paragraph for the Conclusions section. As it is, the sentence seems like suspended.

Answer: we have added a reference to the precipitation, as well as a sentence at the end of the paragraph in the conclusion section. We have updated the text to conform with the four (instead of three) subsections that now compose the Results section.

TEXT MODIFIED

" The subsequent result section is split into **four** parts, which review, **for the precipitation: i) the annual mean, ii) the seasonality, iii) the** daily variability, and **iv) the** monthly and longer term variability. **The final section concludes with the main results, the potential of the method, and future research priorities."**

Data and methods

Domain of study

Page 5. Line 8: I'm not sure to correctly identify the contour indicating the Luni River,as

HESSD

Interactive
comment

Printer-friendly version

Discussion paper



mentioned in the text. Is it the dark blue thick contour which also indicates the upper border of the study area? If so, as I also understand from the sentence at lines 10-11, I would better specify this at this point (maybe moving the sentence at lines 10-11 above)

Answer: This is a misunderstanding, we do not provide the contour of the watershed of the Luni River. However, the Luni River is represented in Figure 1 (new figure, see answer to general comment 4 of the 1st reviewer), which illustrates our point.

The reference to the figure was misplaced and confusing. We have added a new sentence at the end of that paragraph to clarify the reference to the whole watershed.

TEXT MODIFIED

"It may also forms seasonal rivers, such as the Luni River, which has been included in the **study areas**. This particular river flows into the Rann of Kutch, which is a flat salt marsh with complex connections with the Arabian Sea and the mouth of the Indus River (Syvitski et al., 2013), and is bounded on the west by the Aravalli Range. Although not strictly a part of the Indus watershed, it provides a clear and steady boundary for the domain of study. **The total watershed considered for the study is represented by the outer black line shown in figure 1"**

Page 5, Line 9: Please replace "bound" with "bounded"

Answer: replaced

Page 5, Line 14: Please change "while the rest of the year it remains dry" with "while during the rest of the year the basin remains dry"

Printer-friendly version

Discussion paper



Answer: replaced

Page 5, Line 16: I would replace "but exhibit" with "exhibiting"

Answer: replaced as suggested

Page 5, Line 17: Rather than "process" , I would say "circulation patterns" ; also please add another reference in parentheses which is significant for explaining the wintertime precipitation, i.e. Filippi et al., 2014 (Filippi, L., E. Palazzi, J. von Hardenberg, and A. Provenzale: Multidecadal Variations in the Relationship between the NAO and Winter Precipitation in the Hindu Kush-Karakoram. J. Climate, 27, 7890-7902, <https://doi.org/10.1175/JCLI-D-14-00286.1>, 2014)

Answer: indeed, replaced as suggested. The reference has been added

Page 5, Line 18: Please remove "it does" ; the sentence is okay also in this way "As in the southern part of the basin"

Answer: good point, removed

Page 5, Line 24: Not true, from Fig. 2, that there is no precipitation at all in winter in the lower Indus. I would rather say that "the southern part [...] is mostly characterized by summer precipitation (wintertime precipitation is negligible)" , or something similar.

Answer: wrong phrasing indeed. We have modified the sentence.

TEXT MODIFIED

"Thus, the northern part of the basin (hereafter the upper Indus, 595000 km²) includes the maxima of precipitation along the Himalayas and most of the winter precipitation,

HESSD

Interactive
comment

Printer-friendly version

Discussion paper



while the southern part (hereafter the lower Indus, 785000 km²) is characterised **by a single wet season during summer, as wintertime precipitation is negligible**"

Data

I would change the title of Section 2.2 in "Datasets" , Section 2.2.1 in "Rain gauge data" , Section 2.2.2 in "Satellite data" , Section 2.2.3 in "Reanalysis data"

Answer: Agreed, changed accordingly

Page 5, Line 29: Typo, there is a double parenthesis after the citation Yatagai et al.,2012.

Answer: thanks, removed

Page 5, Line 32: Please replace "the fact that" with "because"

Answer: replaced

Page 6, Line 1: Delete "with a period covered" . The sentence should be ... by the same institute extending up to 2015"

Answer: the sentence has been changed to: " A new dataset has been issued in 2019 from the same institute **extending the period covered up to 2015"**

Page 6, Line 7: Please replace "to" after "coverage" with "as"

Answer: replaced

Page 6, Line 15: Please replace "of the available" with "among the available"

Answer: replaced

Page 6, Line 15: What does "variety of input" mean? Please be more specific.

Answer: we referred to the amount and type of observations included in the datasets.

TEXT MODIFIED

"It has the highest temporal and spatial resolution of the selection (sub-daily, and 0.25° like APHRODITE and GPCC-monthly) and **includes a large diversity of satellite observations**"

Page 6, Lines 16-17. I don't understand what the sentence about GPCP_1DD means. Why do the authors specify that this specific dataset is valid only for comparison? What does this mean?

Answer: It does not make sense indeed, all datasets are compared, not particularly those ones. That part of the sentence is removed.

TEXT MODIFIED

"The precipitation dataset from the Climate Research Unit has a similar resolution and time coverage as GPCC-monthly."

Page 6, Line 18: At the beginning of the sentence, please rephrase "All three datasets described above use GPCC"

Answer: We specified the three datasets in the sentence.

TEXT MODIFIED

"All three of these datasets (**TMPA, GPCP-1DD, and GPGP-SG**) use GPCC for calibration"

Reanalysis

Page 9, Line 2: To avoid repetitions, "reanalysis datasets" should be replaced with "reanalysis data"

Answer: replaced

Page 9, Line 3: better to say "can vary" rather than "varies"

Answer: agreed, replaced

Page 9, Lines 3-4: I would rephrase this sentence in this way "Table 3 shows the ensemble of the ten reanalysis datasets which we used in this study".

Answer: Replaced, this is part of the general comment 9 of the 1st reviewer

Page 9, Lines 10-11. I would change a little bit the sentence, for example: "ERA5 currently starts in 1979 (see Table 3) but future releases are expected to extend back to 1950".

Answer: We updated the sentence.

TEXT MODIFIED

"ERA5 currently starts in 1979 but future releases are expected to extend this back to 1950."

Page 9, Line 12: please change "than the others" with "than the other products"

Answer: changed

Methods

Page 12, Line 6: Please add "of precipitation" after "seasonality"

Answer: Does not apply in the improved version of that section

Page 12, Line 9: "issues on" → "issues of"

Answer: replaced

Page 12, Line 9: For the last sentence, I would rather say "Winter is not analysed in the lower Indus as it is an extremely dry season"

Answer: we did not add "extremely" here. Being dry is enough not to have analysed that season

TEXT MODIFIED

"In the lower Indus, we use the same definition for summer, but winter is not

analysed, as it is a dry season"

Page 12, Line 10: Please add "precipitation" before "time series"

Answer: Does not apply in the improved version of that section

Page 12, Lines 11-18. For me all this doesn't fit here. This is already a result or, better, a possible explanation of the reasons why the different datasets show different behaviours. This should be discussed in the Results section, or in a dedicated Discussions section (to be eventually added) or in the Conclusions.

Answer: agreed, the passage is removed

Page 12, Line 22: "as we will discuss...." → "as discussed in the Results section"

Answer: Does not apply in the improved version of that section

Results

Subsection 3.1

Page 13, Line 3: Add "precipitation" before "seasonal cycle"

Answer: Does not apply in the improved version of that section

Page 13, Line 3: The sentence of GPCC needs to be rewritten, I suggest: "... we

compare the datasets to GPCC-monthly data, taken as a reference for this analysis" .I think that it is more correct to state that GPCC-monthly is considered here as the reference rather than saying that it provides "good precipitation estimates" , unless the authors add some references in support of this statement.

Answer: Agreed, we have now justified the use of qualitative statement using GPCC as a reference for illustrative purposes. This is now explained in the methods section (cf. answer to general comment 5 of the 1st reviewer).

TEXT MODIFIED

In the method section: " We first compare the mean and seasonal cycle of each datasets in sections 3.1 and 3.2. For quantitative statements we use GPCC-monthly as a reference"

Page 13, Line 7: I would start the sentence in a different way: "Figure 2 overall shows that all different datasets are able to capture the seasonality of precipitation in the two areas, though with different magnitudes"

Answer: Does not apply in the improved version of that section

Page 13, Lines 7-12. I don't like the description of Figs. 2 A) and C) made in this paragraph. I would avoid sentences like "are ranked in the same order" ; I would try to describe the climatology of precip. as seen by the different datasets taking one of them as the reference (as the authors do, if I understand well). Basically, the figure needs to be better described, also highlighting the performances of the various datasets in summer and winter.

[Printer-friendly version](#)

[Discussion paper](#)



Answer: To clarify the description, this is now presented in a dedicated section (3.2, cf. answer to general comment 8 of the 1st reviewer). We also focus on the months with a minimum or a maximum of precipitation, as well as on bias specific to a season, or more stable throughout the year.

TEXT MODIFIED

See answer to general comment 8 of the 1st reviewer

Page 13, Line 11: Please replace "inferior to" with "less than"

Answer: Does not apply in the improved version of that section

Page 13, Line 13: I would replace "of mean precipitation" with "of the precipitation annual cycle"

Answer: Does not apply in the improved version of that section

Page 13, Line 15: Regridding can be source of uncertainty, depending also on the kind of interpolation which is applied. The bilinear interpolation could not be the most appropriate method for precipitation. So the term "carefully" is questionable in this sentence, in my opinion.

Answer: This referred to the fact that we could have used the grid points whose centre was in the domain, instead of a bi-linear interpolation, which leads to further biases (cf. answer to general comment 5 of the 1st reviewer). But the word "carefully" does not reflect this idea, and is therefore removed. This point is further discussed in a specific paragraph (cf. general comment 5 of the 1st reviewer)

[Printer-friendly version](#)

[Discussion paper](#)



TEXT MODIFIED

See second paragraph of section 3.1.1 in answer to general comment 8 of the 1st reviewer

Page 13, Line 16: I would say that GPCC-daily "uses" GPCC-monthly and not that "is based"

Answer: This sentence is slightly modified in the improved version of the manuscript, and takes account of the comment.

TEXT MODIFIED

"The two GPCC products [...] uses the same climatology."

Page 13, Lines 16-17: GPCC-daily and GPCC-monthly are not so different, as expected. Though GPCC-daily uses less stations, it incorporates GPCC-monthly analysis which uses more stations. I expect that these 2 products are very similar.

Answer: Indeed, we have rephrased this point. We expect the datasets to be similar, but some differences exist, which should be related to the interpolation method we used, and this can be investigated.

TEXT MODIFIED

See second paragraph of section 3.1.1 in answer to general comment 8 of the 1st reviewer

Page 13, line 25: CPC is "drier" or driest? Maybe driest is the correct term and this refers to the upper Indus only.

Answer: CPC is the driest dataset for the upper Indus, and the second driest for the lower Indus. This is now explicitly stated in the text.

TEXT MODIFIED

"For example, CPC is by far the driest dataset in the upper Indus and the second driest in the lower Indus. This is likely related to the low number of observations it includes, leaving vast areas with no or very few observations, including the wettest regions (Figure 2-E)"

Page 13, Line 26: "linear relation" ? I would rather say "clear correlation"

Answer: Correlation refers to a specific statistical tool, which we did not use here. We change the word "relation" to "relationship"

Page 13, Line 30: I would replace "creator" with "developers"

Answer: changed

Page 13, Lines 31-33: please rephrase the entire sentence. Here is (only) a suggestion: "In particular, APHRDITE underestimation of total precipitation (compared to GPCC products) might be related to the fact that it partly relies on GTS data, in which missing values could be treated as no precipitation values. The large dry bias seen in CPC data could be associated with the same issue, since CPC is entirely based on GTS." I still don't understand, however, why a missing value in CPC would be treated as no precipitation.

Answer: There is a misuse of the word "treating" , we have replaced it with "misreporting" . The whole sentence was not very clear either. So, zero values can be reported by mistake, and the quality checks do not identify them as missing values. This is clarified in the text.

TEXT MODIFIED

"They noted that APHRODITE partly relies on GTS data that are sent in near real time to the global network, with risks of misreporting. The risk particularly concerns misreported zero values, harder to detect and which could lead to a dry bias. The large dry bias seen in CPC data could be associated with the same issue, since CPC is entirely based on GTS data"

Page 14, Line 2: "build" → "building"

Answer: replaced

Page 14, Lines 2-5: This sentence needs to be rewritten, it is not really understandable especially when referring to TMPA, and to correlations (what datasets ?); this is really not clear to me.

Answer: This is a minor point and it is removed from the text.

Page 14, Line 8: Please change "Different" with "Several" or "Various"

Answer: We used the word "several" as suggested.

Page 14, line 11: The sentence "they are basin-wide more numerous [...] territory"

Printer-friendly version

Discussion paper



should be rephrased and improved.

Answer: The sentence is split into two

TEXT MODIFIED

"However, the difference in mean precipitation is most likely related to the change in observations from rain gauges. **Although the APHRODITE-2 comprises more observations basin-wide**, this increase mainly happens over Indian territory."

Page 14, Line 13: Rather than "explains" I would say "could reasonably explain"

Answer: changed accordingly

Page 14, Line 24: Remove "somewhat"

Answer: Does not apply in the improved version of that section

Page 14, Line 25: "wetter by a factor of two" . With respect to what? GPCC-monthly? To the observations in general? The reference has to be always indicated in a comparative sentence like this one.

Answer: We modified the sentence so we actually compare JRA with 20CR, making the point about the large spread of values.

TEXT MODIFIED

"the wettest dataset, JRA, is five times wetter than the driest dataset, 20CR"

Page 14, Line 27: The sentence "some discrepancies are evident in the seasonality" could be misleading here, since only at line 33 the authors really report on changes in the seasonality, i.e., monthly shifts in some precipitation characteristics.

Answer: This comment lead us to split the subsection "Seasonal cycles and annual means" in two, one addressing the annual means and biases, and the second the seasonal cycles and seasonal biases. See answer to comment 7 of the 2nd reviewer.

Page 15, Line 5 (the whole paragraph). Besides the dry bias of rain gauges (rain-gauges are known to underestimate solid precipitation), one further reason for the wet bias of the reanalysis products (again, compared to GPCP-monthly) could be related to the "model component" of the reanalyses themselves. Models, in fact, are also known to have a wet (and cold) bias in mountains and in the cold season particularly(e.g., Palazzi et al., 2015; Palazzi, E., von Hardenberg, J., Terzago, S. et al. Clim-Dyn (2015) 45: 21. <https://doi.org/10.1007/s00382-014-2341-z>). This should be added somewhere in the text. Reanalyses are a combination of observations+model which means that they can inherit drawbacks and advantages of both of them.

Answer: Agreed, and this is also suggested by the fact reanalysis overestimate the annual amount found in Dahri2018.

TEXT MODIFIED

- In section 3.1.3 (See answer to general comment 8 of the 1st reviewer)

"Nevertheless, the four selected reanalysis datasets in Table 5 overestimate the Dahri2018 adjusted value, by 20% on average. This suggests that part but not all of the differences between reanalysis and observational data can be explained

Printer-friendly version

Discussion paper



by biases from the latter. Modelled precipitation in reanalysis are likely overestimated in the upper Indus, which corroborates results from previous studies (e.g. Palazzi et al., 2015). "

- Further in that section:

"Reanalyses tend to be wetter than observational datasets in the upper Indus, which is partly explained by the underestimation of the observations."

Page 15, Line 33: "maxima" -> "maximum precipitation values"

Answer: Does not apply in the improved version of that section

Page 16, Lines 4-5: I don't understand the meaning of the sentence "those errors are[...] yearlong" , in particular of the term "consistent"

Answer: We meant that the errors are relatively independent of the season. It is removed in the improved version of that section

Page 16, Line 5: Please consider to change this part "low density observations" with "a low density of observations"

Answer: Does not apply in the improved version of that section

Page 16, Line 18: "over estimations" should be "overestimations" ; "overruled" , maybe better "avoided" ?

Answer: Does not apply in the improved version of that section

Page 16, Line 19: *I would avoid qualitative expressions like "high to very high" , just leave the percent values reported subsequently*

Answer: Agreed, this is removed in the improved version of that section

Page 16, Lines 20-21: *"The summer mean does not converge" , please rephrase this sentence. Do the authors mean that the spread among the various product is large?*

Answer: Does not apply in the improved version of that section

Page 16, Lines 23-24: *In my opinion, the sentence starting with "These latest" and ending with "study domain" would be suitable as a final statement of this section.*

Answer: Agreed, the last sentence of section 3.1 is now an updated version of this one.

TEST MODIFIED

Last sentence of section 3.1:

"Lastly, all datasets suffer from spatial discrepancies, which are detrimental to small-scale comparisons, especially near mountains, but justify our choice to use a larger study **area"**

Subsection 3.2

Note that this corresponds to subsection 3.3 in the new update manuscript

Printer-friendly version

Discussion paper



Page 20, Line 2: Please add "precipitation" between "daily" and "variability" .

Answer: added

Same line: it is not clear to me what the concept of "dependency between each dataset" means

Answer: Our sentence is not related to the lag analysis that follows, it is moved to the new section 3.3.2 "Cross-validation in the upper Indus" . We replaced the word "dependency" with "co-variability" , which is investigated in that section using correlations.

TEXT MODIFIED

- The section 3.3.1 starts by:

"Investigating the daily precipitation variability helps to better quantify the quality of each dataset."

- The section 3.3.2 starts by:

We now start the comparison of the daily variability **between each dataset**. **Particularly, we aim to understand whether the co-variability exhibited between datasets is coming from the use of common methods or data source, or from a good representation of the precipitation variability.**

Page 20, Line 4: Please replace "most of the reanalyses" with "of most of the reanaly-

C52

HESSD

Interactive
comment

Printer-friendly version

Discussion paper



ses"

Answer: Does not apply in the improved version of that section

Page 20, Line 4-5: the sentence in parentheses is unclear.

Answer: TMPA has a sub-daily resolution and we can compute a 24-hour accumulation ending at different times of the day (e.g. 0h, 3h, 6h ... UTC). APHRODITE has daily-accumulated precipitation values, and we would expect the accumulation period to end at 00h UTC. To check this, we test whether APHRODITE values correlate better with TMPA values when these ones are accumulated up to 21h, 0h, or 3h, and so on. The problematic sentence is removed from the paragraph, and we have revised the paragraph discussing the sub-daily lag.

TEXT MODIFIED

In the paragraph discussing the sub-daily lag:

"Possible differences in the End of Day times of the observational datasets are investigated using the sub-daily resolution of TMPA. We compute TMPA daily accumulation with different End of Day time and determine which one maximises the correlation with the other observational datasets. APHRODITE and CPC (after 1998) maximise the correlation with TMPA when for the latter an End of Day at 03h UTC is used."

Page 20, Lines 9-10: Please replace "from APHRODITE" to "APHRODITE-2" with "in both APHRODITE products"

Answer: There is a misunderstanding here, the two APHRODITE datasets have actually an opposite characteristic (on the consideration of different End of Day

time). We have rephrased the sentence.

TEXT MODIFIED

"Neither GPCC-daily nor APHRODITE documentation mention this issue, while a specific effort has been made to homogenise all observations in APHRODITE-2."

Page 22, Lines 28-29: I would rephrase this sentence: "common dependency of the true variability", in particular I'm not really comfortable with the term "true". The correlation between the two types of datasets can be related to the fact that they represent the precipitation variability at this scale in the same way?

Answer: The correlation between the two types of datasets is without doubt related to the fact that they represent the precipitation variability at this scale in the same way, or rather, the correlation is a measure of that similarity. The question here is about the cause of that similarity: it is either because they are based on a similar method or input data, or solely because they both try to estimate precipitation. This is further explained at the start of section 3.3.2

TEXT MODIFIED

- 1st paragraph of section 3.3.2:

"We now start the comparison of the daily variability between each dataset. Particularly, we aim to understand whether the co-variability exhibited between datasets is coming from the use of a common method or data source, or from a good representation of the precipitation variability. All datasets are estimates of precipitation, but they use different methods and input data to achieve this (cf. section 2.2). If

two datasets share a similar method or data source, this could at least partly explain the co-variability between the datasets. If, on the contrary, the two datasets are independent, then the co-variability they share is most likely due to the precipitation signal they estimate. Therefore, the higher the correlation between two independent datasets, the better the estimate of precipitation in both datasets."

- The problematic sentence is modified:

"Therefore, the correlations between the two types of datasets **is not affected by common data or method, and is rather a measure of their quality**, which helps identifying the best datasets in each group."

Page 23, Line9: "analysis of the correlation" → "correlation analysis".

Answer: This sentence is removed

Same line: I would say "ERA-Interim ranks second and is the best performing reanalysis among those which do not assimilate precipitation observations"

Answer: we further modified this sentence to avoid the use of the word "rank"

TEXT MODIFIED

"ERA-Interim has the **second highest correlations**, and is the best performing reanalysis among those that do not assimilate precipitation observations"

[Printer-friendly version](#)

[Discussion paper](#)



Page 23, Line 11: Please add "version" between "first" and "outperforms" .

Answer: added

Same line: "century reanalysis" → "20th century reanalysis" or the correct term for this product.

Answer: we added the word "twentieth"

Subsection 3.3

Note that this corresponds to section 3.4 in the new version

Page 32, Lines 3-4: Delete the part of the sentence after "time scale" , not useful.

Answer: agreed, deleted

Page 32, Line 8: "good" , should be justified.

Answer: The good quality is demonstrated in that section

TEXT MODIFIED

"Those two datasets present a more stable quality and good **correlations as we demonstrate below.**

Page 32, Line 12: Please add "the correlation" before "continues" (subject missing here). Same at Line 14 ("it rises" or "the correlation rises")

HESSD

Interactive
comment

Printer-friendly version

Discussion paper



Answer: added

Page 32, Line 19: Remove "feedback" . This sentence should be rephrased since it is not easily readable.

Answer: The sentence has been removed

Conclusions

Page 39, Line 3: "six" → "six datasets are" ; "four" → "four are"

Answer: changed

Page 39, Line 4: "of datasets" → "of the datasets" ; "each" → "each of them"

Answer: changed

Page 39, Line 5: "true values" , an expression that should be avoided. It is quite clear,also from the analysis presented in this paper, that it is not possible to define a ground truth for precipitation, at least in this area.

Answer: We replaced "true value" with "uncertainty"

Page 39, Line 14: is there any reference to be cited in support to the statement about teleconnections?

Answer: Removed from the updated version of the conclusion. We want to highlight the fact that ERA5 does represent decadal variability.

Page 39, Line 16: *I would express the concept the other way around. For example "The quality of the datasets also depends on the season which is analysed"*

Answer: we rephrased this sentence.

TEXT MODIFIED

"We also found that the quality of the datasets depends on the season."

Page 39, Line 32: *"CPC is also a dry dataset" , I would rather say the "CPC exhibits a dry bias compared to"*

Answer: The new sentence is further improved, but we have considered the comments.

TEXT MODIFIED

"CPC [...] with a large dry bias compared to GPCC-monthly"

Page 40, Line 2. *Is the word "There" at the beginning of the sentence used to say "In this case" (i.e., in the lower Indus)? I prefer "In this case" than "There" .*

Answer: Does not apply in the improved version of that section

Page 40, last sentence: *I suggest to rephrase this sentence, especially avoiding expressions like "while reanalyses are even worse" . There are other ways to say that uncertainties remain. I would point more toward the lesson learned in this paper, with a more, let's say, positive view. That sentence is really sharp.*

Answer: We changed the last paragraph to emphasise several points: large uncertainty remains, but some datasets perform better, cross-validation between reanalysis and observational datasets are possible, and we suggest future possibilities such as quality monitoring.

Please also note the supplement to this comment:

<https://www.hydrol-earth-syst-sci-discuss.net/hess-2019-303/hess-2019-303-AC1-supplement.pdf>

Interactive comment on Hydrol. Earth Syst. Sci. Discuss., <https://doi.org/10.5194/hess-2019-303>, 2019.

HESSD

Interactive
comment

Printer-friendly version

Discussion paper



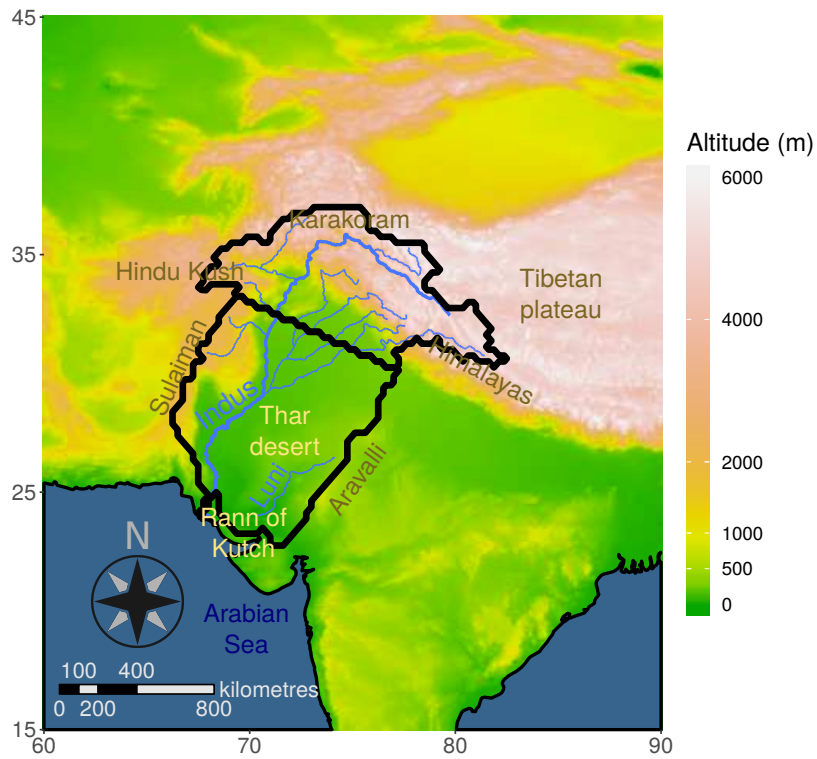


Fig. 1.