

Response to Anonymous Referee #1 Received and published: 22 December 2020

The authors describe a method to upscale high-resolution data, based on a back-tracking approach also used by former work of Yamazaki et al. 2009 or Wu et al. 2011). The authors show methods to assess the quality of different methods.

The paper represents significant progress as it is a further development of the concept of Yamazaki et al:

- The authors can show that their approach yields better results in comparison to other methods
- It is open source
- The authors show that their method can be applied in hydrological models towards free scalable models
- It can be used as the common D8 network

The presentation quality and scientific quality is good. A few points could be discussed in a different way.

We are pleased to read that our manuscript is considered significant progress to the reviewer. We would also like to thank the reviewer for the thorough review and comments, which we believe have led to an improvement in the manuscript. Our response to each comment can be found in the paragraphs below. Most importantly we have clarified some points regarding the river width and DMM30 dataset at various sections of the manuscript, improved a figure in the methods section, added a sensitivity analysis for thresholds used in the IHU method and replaced two figures in results section with one new figure which allows for a more quantitative comparison between upscaling methods.

Main point of criticism is that it does not include a link to the work done in the ISI-MIP (<https://www.isimip.org/>) project. In this project, quite a number of hydrological models use a defined set of input data as a global 30 arcmin setting. The network used here is the DDM30 (Doell and Lehner 2002). It is questionable, if this database is the best choice (see Zhao et al. 2017 <https://doi.org/10.1088/1748-9326/aa7250>), but it is used as the defined river network. The paper can run without a direct comparison to DDM or a comparison to 30 arcmin, but the value of this paper (and the numbers of citations) can be improved, if it is compared against: a.) 30 arcmin (maybe instead of 15 arcmin, which is rarely used in hydrological models) b.) DDM (maybe instead DMM, as the DMM is not so often used (cited 25 times and DDM cited 147 times))

We agree with the reviewer that DDM30 is an important dataset used in many global hydrological models and have updated the introduction to reflect this better. We deliberately selected DMM instead of the DDM30 method as benchmark for IHU (proposed method) as to our understanding DMM has been re-used as a method with different source datasets (Thober et al., 2019), while the method used for DDM30 (hereafter DDM30 method) was only used to derive the DDM30 dataset. Furthermore the DDM30 dataset also required extensive manual editing (Döll and Lehner, 2002), which makes it impossible to compare the method in an automated manner. Finally, DMM is arguably a slightly more sophisticated method compared to the DDM30 method. The DDM30 method sets the upscaled flow

direction based on the fine-resolution flow direction of the outlet pixel of each coarse-resolution grid cell, where the fine-resolution outlet pixel is the pixel with the largest upstream area within each coarse-resolution grid cell. The DMM uses the same fine-resolution outlet pixel as the starting point, but the upscaled flow direction is set after tracing the fine-resolution flow direction downstream until it leaves a buffered area around the cell of origin (for details see Appendix A) which is arguably a better estimate for the coarse-resolution flow direction. The choice of resolution is based on the increasingly higher resolution of global hydrological models (Bierkens, 2015) as stated in the introduction. Based on this observation most models will likely run on finer spatial resolutions than 30 arcmin which is why the multi-resolution MERIT hydro IHU dataset contains maps up to 15 arcmin resolution.

Using a power function of the upstream area for river width is a weak point here. This does not work for a global dataset and not even for the River Rhine with high runoff in the mountains and low runoff in the lowlands. This approach is not state of the art. The paper says it will provide a parametrization for distr. hydrological models. The approach for providing river width is not appropriate. For sure it would be fine to have the full package incl. river width and Manning's roughness. I think it is still a fine paper, if you exclude river width (as you exclude Manning's anyway)

We agree with the reviewer that this is a simplistic approach which will not yield satisfying results when applied over larger areas with different climate. In our paper we only applied it to the case study experiment to fill data gaps in the existing river width layer, for which we argue that this simplification won't affect the conclusions based on the experiment as it is set up as a sensitivity analysis rather than a validation with observed data. The global river width layer of the MERIT hydro IHU dataset represents river width estimates from the original 3 arcsec MERIT hydro dataset at the fine-resolution outlet pixels of each coarse-resolution grid cell of the dataset and has no data where the underlying data is missing at that point. We have clarified this in the methods and focus on flow direction, sub-grid river length and slope parameters in the abstract and introduction. In the discussion we also mention that the power-law is a strong simplification and refer to better alternatives if applied for a real instead of synthetic event simulations. We would like to keep the river width layer with data gaps as part of the dataset however, as we think it can be a useful starting point to derive a full coverage river width dataset for a region of interest using more advanced methods to fill these gaps, e.g. based on regression techniques similar to Barbarossa et al. (2018).

Detailed comments:

60: As I said, I am not a fan of the DDM30, but it is THE reference river network in a global hydrological intercomparison project.

To reflect this we have added a sentence that DDM30 is "used by most global hydrological models within the Inter-Sectoral Impact Model Intercomparison Project"

66: Wu et al. 2011,2012 and Yamazaki (2009) already give out length, Yamazaki already give out slope or elevation at the outlet point.

Thanks for pointing this out. We rephrased to “Furthermore, none of the D8 upscaling methods derive both sub-grid river parameters of length and slope, which are required for many hydrological models.”

85 .. often defined by ... Isn't it a requirement to be a multiple of the finer grid?

You are correct, we rephrased the sentence to: “IHU requires a target resolution (grey dashed grid lines) which is multiple of the input resolution and two input maps: a fine-resolution flow direction and upstream area map [...]”

115: the equation needs $|x-x_0|^{0.5}$ instead of brackets

We have updated equation 1 accordingly.

118: if no output pixel is found... where does this happen in fig 1

We have added a link to the figure to the explanation of step 1-2: “see the trace downstream of the outlet pixel of cell b3 to cell c3 in the example”

126: Maybe a description like in chess B2 instead h would be easier

Thanks for this suggestion. We have updated figures 1 and A1 and the step-by-step description with your suggestion.

154: You have several thresholds in your method e.g. \sqrt{R} , min upstream_area = 0.25, length of cell = 0.25. Did you test this setting, did you do a sensitive analysis of these values. Where are they from? Maybe for the Rhine it would be good to show some variation of these thresholds

These assumptions have been tested, but were not included in the manuscript. The \sqrt{R} is based on EAM (Yamazaki et al., 2008). The length and upstream area thresholds are found by trial and error. Other studies use similar thresholds for minimum length, but with different values, 0.5 in Yamazaki et al (2009) and 0.6-0.8 in Wu et al. (2011). We found that these values are too large when applied to higher resolution target grids compared to the aforementioned papers. We have added appendix E with a sensitivity analysis based on the Rhine basin as suggested by the reviewer and added the following text to section 2.1: “The sensitivity of the R parameter to define the effective area in step 1-1 as well as the minimum length and minimum upstream area thresholds used to optimize sub-grid river length in step 3 are tested for the river Rhine basin, see appendix E. As step 2-4 are iterated, the minimum river length and upstream area thresholds may also affect the upscaling accuracy as it may provide room for improvements in the next iteration of step 2. We found that the thresholds change the accuracy of the upscaled maps at less than one percent of the output basin cells see Figure E1. A lower minimum upstream threshold generally has a positive effect on the upscaling accuracy and number of cells with small river length but increases the number of cells with small upstream area. The selected thresholds provide a balance between accuracy and cells with small river length or contributing area, but if the latter is of less importance the minimum upstream area threshold might thus be lowered for improved accuracy.”

189: Nice solution of these “orphan” problem – upstream cells that have no direct parents

Thanks.

204-206: This paper does not show a valid way to derive river width for all cells (and it is stated well, you need the parameter for all cells). Filling up with a power function of upstream area will not work. Maybe using some regression/machine learning technique like in Barbarossa et al. 2018 (<https://www.nature.com/articles/sdata201852>) will help. Maybe dismiss 204-206 and 2F (and write a second paper on width and Manning's). For the routing example, your assumption of width and Manning's is ok

While we agree with the reviewer that a full coverage river width dataset is required for model application, we think the MERIT Hydro IHU river width data layer is still of added value. It provides a useful starting point to derive a full coverage river width dataset for a region of interest. As this is not the focus of the paper we have not tried to derive complete coverage of this data. We have amended the text to reflect this: "The river width is based on the MERIT Hydro width data layer at the outlet pixel. Note that this data contains gaps, i.e. not all outlet pixels have a river width in the underlying data, see Figure 2F which shows river widths in green colors. For global coverage and application in hydrological models these gaps need to be filled which is outside the scope of this paper. This data layer could still function as a starting point for any gap filling based on regression techniques (Andreadis et al., 2013; Barbarossa et al., 2018)"

205: Which outlet pixel in @F does not have a river width in fig 2F. Using river width interpolation with a power function and upstream area is a really weak assumption.

We agree that upstream area is a poor predictor for river width when applied on a large scale. Note that we only use this for a specific experiment in a case study, for which the reviewer agrees it is an OK choice. We have added a sub sentence to explain the figure depicting the river width in 2F better, see previous response.

222: As before: it is a dataset, but an incomplete dataset for kinematic routing missing an adequate solution for river width and channel roughness. I am not asking for these 2 additional parameters, but mentioning that these 2 are missing for a complete dataset (and maybe river depth, too).

We do not want to claim that the dataset is complete, to clarify this we have added the following to the discussion "Besides flow directions, IHU derives additional layers of sub-grid drainage area, river length and slope data, a river width estimates for large rivers and hydrologically adjusted elevation. While these layers cover most parameters required in the routing modules of many hydrological models, for a complete river parameter dataset a full-coverage river width layer is required as well as river bed roughness. For more advanced routing models a river bed level and river bank-full depth might also be required (Yamazaki et al., 2011)."

229: Also mentioned before: DMM is rather special, a comparison to DDM30 would be better

While we agree the DDM30 maps have more applications, the method behind DMM is more re-used and arguably more advanced as explained in an earlier response. Furthermore, a large-scale comparison against the DDM30 method is impossible because of the manual editing applied to the DDM30 map (Döll and Lehner, 2002).

260: Not so clear, why the minimum upstream area is chosen to be 10 km². Is this done only for the original 3arcsec, or also for the 30 arcsec version? A 1km² threshold would be more reasonable? Why having a network to 30 arcsec and then aggregating again to 10km²? Adding a reason for 10km² would be ok.

The runoff in each headwater cell is assumed to drain instantaneously to the river channel. By using this threshold, the area for which we assume instantaneous drainage is more comparable between resolutions. This also follows the implementation in hydrological models such as wflow (Imhoff et al., 2020) where a minimum upstream area is used to define river cells for which river routing is performed. We have clarified this in the text: “By using this threshold, the area of headwater catchments for which we assume instantaneous drainage is more comparable between resolutions.”

265-273: For the synthetic runoff event, a simple assumption is ok, like equation 5 and roughness=0.03. What about the river depth to get the perimeter you need for the kinematic routing?

The wetted perimeter is calculated each time step based on the water depth. Basically, this assumes a rectangular profile without floodplains. While we know this is a strong simplification and floodplain storage is a significant process in river routing (Zhao et al., 2017), we argue that for the experiment this is less important as it is set up as a sensitivity analysis rather than a validation with observed data to assess the effect of errors in the flow direction on simulated streamflow.

273: later in 357 you describe the synthetic runoff event, It would be better to describe here in more detail how your synthetic event looks like. From your sentence in line 356 I assume: Uniform runoff for the whole Rhine of around 0.2 mm per day (0.002 per 15 min) to reach 500 m/s at run outlet and then increasing to 0.014 mm per 15 min to reach peak of 3000 m/s?

Great suggestion. We have slightly modified the experiment to represent more realistic average and extreme discharge conditions for the Rhine river and added the following text to section 3.2 “The runoff event is triangular shaped with a total duration of 10 days, it starts with 1.2 mm day⁻¹ and increases linearly to 6 mm day⁻¹ in 5 days after which it decreases back to 1.2 mm day⁻¹ in the next 5 days. This yields an initial flow of around 2,700 m³s⁻¹ and a peak discharge of around 10,800 m³s⁻¹, which roughly corresponds to average and around 1-in-35 year discharge conditions for the Rhine basin at Lobith (Hegnauer et al., 2014).”

350: A table for the Rhine as the table 2 would be good. Maybe even later and including the synthetic runoff results.

See response to comment on line 376.

371: grey line as cumulated runoff?

This should indeed be accumulated runoff, we have changed this in the caption of the figure.

376-404: This part is interesting, but would benefit if it concludes in a method which can be used to compare different methods in numbers e.g. creating a table with flood peak magnitude (btw a flood at around 3000 m³/s is not a flood

in the upper Rhine) and timing like the numbers in line 383 and line 385. But due to the different N, the numbers are not really comparable. How about selecting only locations which all methods have in common, describing a method to find these locations and then it is possible to set up a table with peak magnitude smaller or bigger than 2%, 5%, 10% and flood peak timing different by percent of runoff peak time to routing peak time

We have replaced Figure 8 and 9 with a new summarizing Figure 8 including CDFs which show the difference in flood peak timing and magnitude at different percentiles of the locations, which we think reflects the full distribution of the data better than a table but still allows the reader to easily compare the statistics at different levels. The original Figure 8 and 9 have been moved to the appendix.

384: maybe not an absolute hour, but a percentage of the difference between running time between runoff peak (gray line) and reference time (3 arcsec model). Because it does not matter so much if the delay in a big basin is 2 hours, but it matters if it is in a small basin.

We do agree with the reviewer that the difference in timing should be seen in relation to the upstream area at each location. We have therefore scaled the markers in Figure 8 with the upstream area. We could not think of a method to express the difference in timing as a percentage as it is not clear what the reference should be.

442 As before: river width I would delete from this list as you cannot derive it in a proper way with IHU.

We have amended this part in the discussion; “To achieve complete coverage of river width, the sub-grid river width data requires to be interpolated for data gaps and lake and reservoir areas if these were to be modelled explicitly in the routing model. Here, we used a strongly simplified power-law relationship between width and upstream area. For applications for real events instead of sensitivity analysis with synthetic data, this estimate should be improved using the well-established geomorphic relationships between bank-full discharge and river depth as proposed in the downstream hydraulic geometry framework (Leopold and Maddock, 1953; Savenije, 2003), for instance by the clustering approach proposed by Andreadis et al. (2013) or additional river width data from e.g. Allen and Pavelsky (2018)”

448-444: To my understanding, there is no well-established geomorphic relationship between discharge and river depth nor river width. It is mostly regression between discharge, upstream area, etc. like in Pistocci 2006 or others. A way to improve this is machine learning and feeding it with climatic, geomorphic data like Barbarossa et al. 2018 or using advanced technics of remote sensing e.g., Allen and Pavelsky 2018 or a combination of both. Your approach for having a full dataset for benchmarking is ok, but maybe dismiss the part for river width.

There is a geomorphological relation between width and discharge. According to Lacey’s formula the width of a natural channel at bankfull capacity is proportional to the root of the discharge, this is well explained by Savenije et al (2003). This reference is added to the discussion, see previous response.

465: The Merit DEM (Yamazaki et al. 2017) is a very good DEM. But mostly due to anthropogenic overprinting, rivers do not always follow the lowest elevation. They are redirected or even on a higher level than the surrounding

landscape (there are many examples of this in the Netherlands). One way to improve the DEM would be to burn in the existing river network. Not part of your work here, but maybe something to think of in the discussion.

In the case of this paper we have used the MERIT Hydro DEM and flow direction dataset (Yamazaki et al., 2019) which is derived by burning vector files of channels and rivers from various sources in the MERIT DEM. Of course these data also have limitations as pointed out by the reviewer. For this paper however, we focus on flow direction upscaling and assume that the flow directions of the original high-resolution data are correct. We have added this assumption to the discussion: “In this study we benchmarked several upscaling methods based on the same baseline hydrography data. This choice was made to focus the paper on differences in upscaling methods, where we assume the underlying high-resolution data is correct. For future studies it would be interesting to also compare [...]”

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