

*We would like to thank all reviewers for their constructive comments to our manuscript. A point-by-point response to all comments raised follows below. Throughout the response, the reviewers' comments are presented in black, and our responses are in blue. The line and figure numbers in red correspond to those in the clean version of the revised manuscript.*

## **Response to Reviewer 1**

This paper studies changes in spatial flood extents across Europe and its drivers using a state-of-the-art hydrological model. The paper reports that, on average, there has been an increase of 11.3% in flood extents across Europe over the past 70 years, with regionally varying trends and regionally varying drivers. The work is well-presented, comes across as robust (though with some of the extensive modeling dependencies and relatively low NSE scores for many regions that's hard to truly assess), addresses a relevant topic, and goes clearly beyond the earlier works on this topic (that are also well cited by the authors). I commend the authors for submitting such an organized manuscript and I do not think that my comments would further improve this paper. Well done!!

Thank you for the recognition of this paper!

## Response to Reviewer 2

The manuscript “An increase in the spatial extent of European floods over the last 70 years” by Fang et al., presents a large-scale analysis of the spatial extent of floods and its spatial and temporal variations in the last 7 decades. The analysis is based on model simulations from the mHM model driven by observational data. The study finds that increased on average over most parts Europe and attributes its changes to changes in the magnitude or the spatial dependence of its drivers. The manuscript is well written, and the analyses and results are presented in a convincing way. Please find my comments below:

### Major comments:

Comparison with HANZE: at best the detection rate of the 100 largest flood events flood events compared to the HANZE database is 50%. This low detection rate raises questions on the threshold used for the definition of flood events. The authors define flood day using the 99th percentile. This translates in more than 3 events in a year on average in each pixel. Many of the selected ‘flood days’ are therefore ‘just high-flow days’ (not even all annual maxima cause inundations). This could be a cause of this big discrepancy with the HANZE database and could suggest the use of a higher threshold for the definition of flood days (e.g., the 5- or 10-year flood).

### Response:

Thank you for your suggestion. In addition to utilizing the flood-day threshold of 99% as presented in the manuscript, we also investigated thresholds of 99.7% and 99.9%. The ratios of identified flood events do not change much (the detection rate increased to 54% and 52% for 99.7% and 99.9%, respectively). It is worth noting that our analysis focuses solely on runoff extremes, without accounting for human infrastructure or other exposure. Consequently, runoff extremes may not always result in measurable impacts, thus may not be documented in impact-based flood databases such as HANZE. Moreover, employing a much higher threshold (e.g., the 5- or 10-year flood) for defining flood days would substantially reduce the sample size for studying trends in flood extremes and consequently increase uncertainty. We therefore kept using the 99th percentile as a compromise between sample size and accuracy of matching recorded flood impact.

Figure 9c and L241 “changes in soil moisture seem to play a minor role in the detected changes in flood characteristics. This is in contradiction with the findings of Blöschl et al. (2017, 2019) and Bertola et al. (2021), Tarasova et al. (2023) who find that antecedent soil moisture is relevant to explain negative trends in flood magnitudes (and shift in timing) and increase in flood-poor periods in the Mediterranean catchments. How do the results of this analysis compare to this literature? What are the reasons of this discrepancy? Are the changes in flood

extents caused by different drivers than trends in flood magnitudes and temporal clustering of floods? How is soil moisture estimated in this analysis?

**Response:**

We admit that this sentence lacks precision, and replacing the word "characteristics" with "extent" would be more appropriate. Additionally, we would like to clarify that when referring to the "minor" role of soil moisture, we intended to emphasize its relative importance compared to the dominant roles of snowmelt in Northern Europe and rainfall in Central and Southern Europe in influencing the change of flood extent. However, this does not imply that the effect of soil moisture is negligible.

The reason why soil moisture is not thoroughly discussed in this study is because it exhibits a more localized and secondary effect compared to rainfall and snowmelt. However, thanks to the reviewer's suggestion, upon closer examination of the soil moisture effect, we also find that it is significant in some regions. Therefore, we incorporated a discussion into the revised manuscript to further explain the role of soil moisture in **Lines 255-261**: *“For instance, in Germany and France, although soil moisture decreases, flood extent increases due to more extensive heavy rainfall, highlighting the dominant role of rainfall compared to soil moisture. However, its impact can be substantial at the regional scale. For example, in the northern UK, a strong increase in soil moisture contributes to the increase in flood extent; while in northern Iberia, the decrease in soil moisture is associated with a reduction in flood extent. These findings align with those of Blöschl et al., (2019) and Bertola et al., (2021), who revealed a similar role of soil moisture in influencing flood magnitude in these regions. Furthermore, in the Mediterranean Sea region, a decrease in flood extent is partly attributed to the decrease in soil moisture, generally aligning with the findings of Tarasova et al., (2023).”* Therefore, our results are not contradictory to previous studies; rather, we prioritize the investigation of dominant drivers over secondary and more localized factors such as soil moisture.

The separation of the contribution from runoff magnitude and runoff spatial dependence not only aims to disentangle the contribution from these two sources but also serves as a bridge to enhance our understanding of the drivers (e.g., rainfall, snowmelt, soil moisture, as illustrated in **Section 3.4**) of flood extent. In addition, soil moisture is an output from the mHM model, as stated in **Line 80**.

L346-348: only drivers occurring in the spatial area of flood events are considered. This has big implications in the attribution analysis especially for very large rivers, as contributing drivers occurring within the actual catchment area are not considered (often drivers occurring in one part of the catchment, e.g. snowmelt or rainfall, cause flooding downstream where these drivers do not necessarily occur). What are the implications on the attribution results?

**Response:**

We acknowledge the reviewer's concern regarding the potential implications of flood contributing area selection on the attribution results, and we also commented on this aspect in the Discussion (Section 3.5). For instance, in Figure A8, we illustrate the total number of flood days contingent upon days when an outlet of a specific catchment is flooding. Our analysis reveals that *"if an outlet grid cell experiences flooding, there is a high likelihood that grid cells within the corresponding catchment also experience flooding"* (Lines 372-373). This suggests that although we do not encompass the entire contributing catchment for each grid cell, our event-based findings remain credible.

We do note that this approach performs more effectively for smaller catchments compared to much larger ones. Nonetheless, considering the drainage area for every grid within each event would be highly challenging. Despite this limitation, our attribution results, such as the spatial distribution of snow-driven and rainfall-driven floods, exhibit strong consistency with previous studies utilizing different attribution methods (Jiang et al., 2022).

#### **Specific comments:**

L39-46: it is true that “other studies rely on observations and may miss important information due to uneven spatial distribution of stations”. On the other hand, models (like the one used here – L65-72) are calibrated and validated using observations so have this intrinsic limitation too. Furthermore, models have other limitations, e.g. modelling uncertainty and resolution of simulations (in this case gridded runoff simulations that are quite coarse –  $0.125^\circ \approx 11\text{km}$  ...). Furthermore, for the attribution analysis the study relies on EOBS (L79-80).

#### **Response:**

We agree that also hydrological models may be affected by the uneven distribution of runoff stations. However, it is important to highlight that validating grid-based simulations against station-based observations implies not only the model's feasibility and reliability for the validated locations but also the potential feasibility of other unvalidated locations due to the physical processes encoded into the model. This aspect can provide valuable insights into ungauged areas and improve the quantification of flood extent.

Additionally, despite the model's resolution limitation (e.g.,  $0.125^\circ$  in our study), it still allows for a more refined estimation of flood extent compared to station-based research. For example, the flood synchrony scale, commonly used for quantifying flood extent from a station-based perspective, is defined as the largest radius of the circle within which half of the station flooding occurs near simultaneously (Berghuijs et al., 2019). However, its application in regions with scarce runoff stations may introduce considerable bias due to the distance between stations. While the grid-based simulation could help alleviate this limitation. Note that we also acknowledge other limitations of the model simulation besides resolution, as illustrated in Lines 349-356.

L21 “spatially compounding river floods”: the use of “compounding” seems inappropriate in this context as we are talking about spatially widespread events and there is no mention of simultaneous occurrence of flood drivers in this section (or elsewhere in the paper). I suggest substituting “compounding” with “widespread” or similar.

**Response:**

Thanks for your suggestion. We changed it in the revised manuscript (Line 21).

L52: I suggest citing Lun et al. (2020) – the first study detecting flood-rich and flood-poor periods in Europe.

**Response:**

Thanks for your suggestion. We added it in the manuscript (Line 52).

L100-106: are flood days defined at each grid cell separately? Spatially connected flood days (i.e. pixels) and overlapping flood patches are ‘further combined’. Does this mean that they are considered as one single event? Please clarify.

**Response:**

Yes, the flood days are defined at each grid cell separately and then the overlapping flood patches are further combined together to form a single event. We clarified this part in the revised manuscript (Line 108).

L125: E<sub>past</sub> and E<sub>pres</sub> denote the AVERAGE flood extent?

**Response:**

Yes, E<sub>past</sub> and E<sub>pres</sub> denote the temporally-averaged flood extent over the historical period (1951-1980) and present period (1991–2020) for each grid cell, respectively. We clarified this in the revised manuscript (Line 137).

L158: 244 flash floods from the HANZE dataset are captured in the dataset. However, flash floods typically occur over small catchments (a few km<sup>2</sup>) while the catchment area that is captured is at least of the order of magnitude of 1000 km<sup>2</sup> (due to the resolution of the gridded simulations). Similarly for the time dimension, i.e. flash floods typically last less than 24h, while the resolution of the simulations is daily. How can mHM model simulations capture such flash floods? What are the implications in terms of such identified events?

**Response:**

Yes, we acknowledge that flash floods often have relatively small spatial extents. However, note that in our comparison, we assess the identified flood extent against the affected NUTS3 regions documented in the HANZE database, rather than pinpointing the exact spatial extent of specific flash floods. This approach may potentially increase the detection ratio of flash floods.

Regarding temporal resolution, as outlined in the method section, our detection method employs a moving window of  $\pm 3$  days (Line 97). Additionally, the temporal resolution of the impact-based flood dataset (HANZE) is also daily, which helps in capturing short-duration flash floods. The implication of identifying such events is to provide confidence in the applicability of mHM simulations and the flood detection algorithm for studying changes in large-scale floods.

Figure 2: is this figure only representing the events in the HANZE dataset or does it contain results of this analysis? If it does not contain results of this analysis, it should be moved to another section (e.g. appendix).

**Response:**

Yes, thanks for your suggestion. The figure only represents the events in the HANZE dataset, and we have put it in the appendix section (Figure A2).

Figure 9: it is not clear if the maps show changes in snowmelt, rainfall and soil moisture over all days in the two periods or if they refer to changes for flood events only (i.e. only the rainfall causing flood events or changes in rainfall in general?)

**Response:**

Sorry for the confusion. The spatial maps in Figure 9 show changes in snowmelt, rainfall and soil moisture over all days in the two periods. We have clarified this in the revised manuscript.

L329: “aligns closely with an independent impact-based

**Response:**

We’re not sure what this comment refers to.

Figure A1: labels and titles of the plots are not fully clear and not explained in the caption.

**Response:**

Thanks, we provided more details for Figure A1 in the revised manuscript as follows: “Specifically, “MAF” compares observed and simulated maximum annual floods in terms of their discharge and day of occurrence; “MAF date” compares the observed and simulated discharge on the exact date of the observed annual floods; “MAF event” compares observed discharge and date of maximum annual flood to the peak of corresponding runoff event. More details about these three cases can be found in Tarasova et al., 2023.”

### **Response to Reviewer 3**

The manuscript titled “An increase in the spatial extent of European floods over the last 70 years” by Fang et al., aims to identify large spatio-temporally connected flood events over the last 70 years in Europe using the mHM hydrological model.

Overall, the manuscript is well organized and written. For some of the methods used in the study a better justification should be presented so that the reader is better aware of the reasons for certain choices.

#### **Response:**

Thanks for the feedback, we now provide a schematic overview figure and justifications for the different methodological choices.

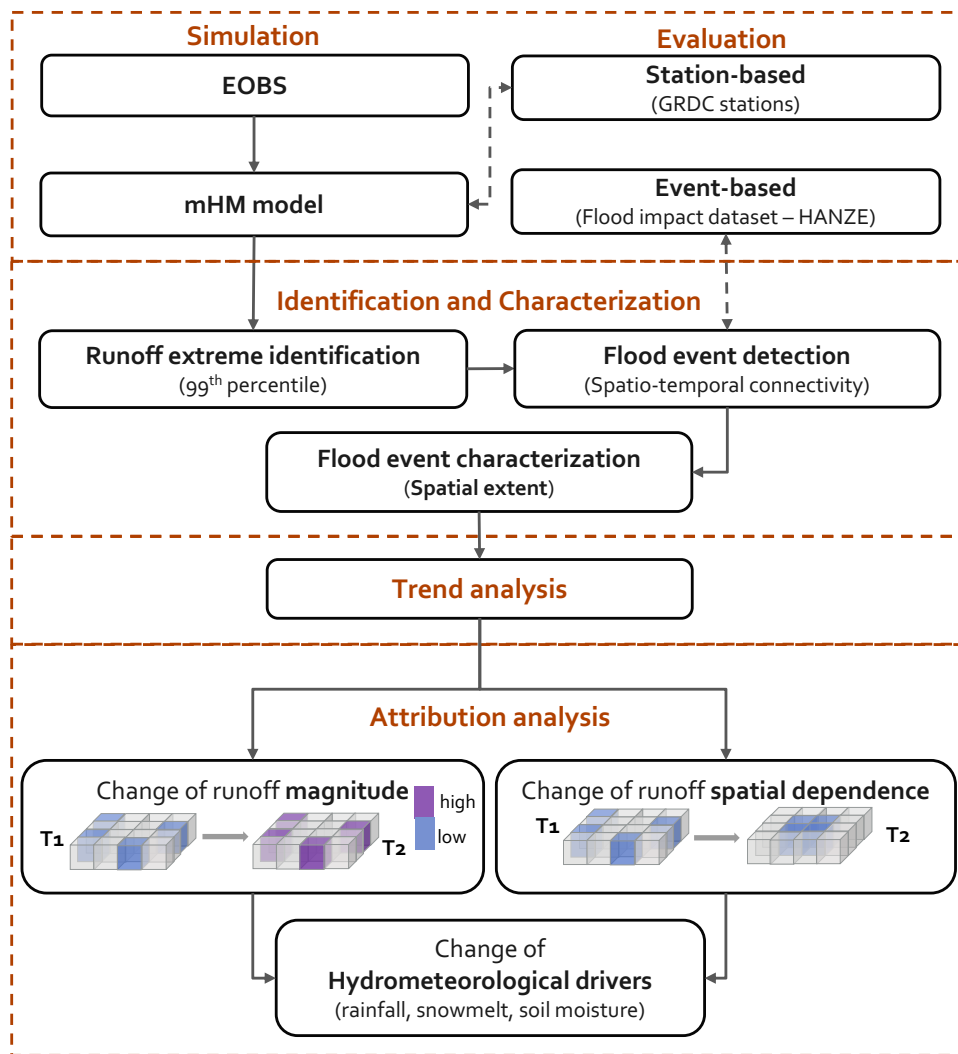
For further details find my comments below.

#### **General Comments:**

Naturally, as with such a complex study, a lot of data sets and models have been used so that at some stage the reader might get lost what has actually been done. I think it would be helpful to add a schematic/graphical representation showing the inputs, models used and outputs and their ways of comparison in one to two panels to make things clearer.

#### **Response:**

Thanks for your suggestion, we added a schematic figure (Figure 1) in the revised manuscript as follows:



**Figure 1.** Main workflow of the study. The figure outlines the main analysis steps undertaken in this paper. In addition to the mHM model simulations driven by E-OBS data, we also analyze and compare the results obtained against mHM simulation driven by ERA5 data and the GloFas dataset.

Additionally, it is unclear why the period beginning with 1951 was used. The mHM model has a spin-up period of 1940-1959. Hence, I think the analysis should be conducted only after... This would also resolve the issue that as described in L 126 10 years of data are discarded (1981-1990). So the “attribution” could then be done using the two periods 1961-1990 and 1991-2020.

**Response:**

Thanks, it seems the spin-up of mHM was not explained in sufficient detail. The model’s initial conditions were created in two decades, namely 1950-1959, and then reading the restart file of 1959 as an initial condition in 1940 run until 1949 (here, using pre1950 EOBS version, see [https://surfobs.climate.copernicus.eu/dataaccess/access\\_eobs.php](https://surfobs.climate.copernicus.eu/dataaccess/access_eobs.php) was used). This means that



in total, 20 years were used to create steady-state conditions starting already in 1950. So, the decade 1950-1959 is not affected by the spin up anymore. We use the two time periods as in the manuscript to maximize the trend signal and make use of the full time period available. We added the spin-up details in the revised manuscript as follows: “*For the spin-up of mHM, the model was firstly initialized in 1950-1959, and then the restart file of 1959 was read as an initial condition in 1940 run until 1949. This means that in total, 20 years were used to create steady-state conditions starting in 1950*” (Lines 70-72).

Also, the section 2.5 on “attribution” of changes in flood events needs to be re-written. A lot of assumptions are being made in this section, but it remains illusive why certain choices are being made (suggest adding some explanations instead of just citing references that have done the same previously). Additionally, the authors should aim to add some “physical reasoning” to this mainly statistically based attribution exercise. Additionally, the attribution reminds of the use of conditional probabilities. Please elaborate/discuss why this approach has not been considered instead, i.e. what are the advantages of the current approach...

#### **Response:**

We agree that this section requires a more detailed explanation. We added the explanation in Lines 128- 136: “*In general, the occurrence of a compound event is shaped by the multivariate probability density function (pdf) associated with the variables describing the event (François & Vrac, 2023; Singh et al., 2021; Sklar, 1973.; Zscheischler & Seneviratne, 2017). According to copula theory, a multivariate pdf can be decomposed into the marginal pdfs and the copula describing the dependence between the individual variables (Sklar, 1973). Therefore, compound event changes can be shaped by changes in the marginal pdfs and changes in the dependence structure (Bevacqua et al., 2021; Zscheischler & Seneviratne, 2017). In our specific case, the marginal distributions describe the runoff at individual locations, while the dependence describes the dependence between the runoff at different locations. Quantifying the contribution to the compound event changes from marginal distribution and dependencies is common in compound event research as it provides insights into the origins of changes (Bevacqua et al., 2021; François & Vrac, 2023; Zscheischler & Seneviratne, 2017).*” For instance, Bevacqua et al., (2021) applied this approach to differentiate the contribution from rainfall magnitude and rainfall spatial dependence to the extent of winter extreme rainfall. Here, we employ a similar approach to test the hypothesis that flood extent can potentially be influenced not only by changes in runoff magnitude but also by changes in the spatial dependence of high runoff events, as outlined in the introduction (Lines 53-56).

In the physical reasoning part, utilizing the contribution decomposition method mentioned above, we find that the expansion of flood extent across Northern Europe is primarily driven by the amplified runoff magnitude resulting from increased rainfall and snowmelt (Figure 9).

Conversely, the increase of flood extent across central Europe is dominated by the enhanced spatial dependence of runoff extremes, attributed to more widespread heavy rainfall, as outlined in [Section 3.4](#). Thus, the decomposition method strongly aids in elucidating the underlying mechanisms behind changes in flood extent.

We agree that conditional probability is commonly used in attribution analysis. For instance, one can investigate the change of flood frequency or magnitude conditioned on different weather types for climate modes. However, in our case the approach would not help much in addressing our main research objective, namely to understand trends in the flood extent and its drivers.

Finally, I am missing a discussion of the presence of human effects of the hydrology/floods through dams etc. particularly with regard to the conclusions drawn with regard to the attribution of changes in flood extent. With more and large dams that have been built in the recent decades in south of Europe a lot of water will be held back and is no longer available for flooding.

**Response:**

We did not include dams and reservoirs in the model setup, but we agree with the reviewer that it might indeed be a limiting factor, and we acknowledged this in the revised manuscript ([Lines 353-356](#)): *“Furthermore, we note that no information on dam and reservoir constructions, which might change flood dynamics over time, are included in the model setup. We are unaware of a database that would harmonise such information across the entire European domain over time. Possibly even more crucial, bathymetric data, which would be needed for sedimentation processes, is not available.”*

How do the authors reconcile the reality with the modelled results... Please elaborate and discuss.

**Response:**

The model results have been validated against various independent data sources. As illustrated in [Section 3.1](#), we not only compare the mHM simulated runoff with GRDC stations but also validate our identified flood events against an impact-based flood database (HANZE), showing a relatively high consistency. Hence, although our results focus on runoff extremes that may not necessarily lead to impactful floods, they still provide valuable insights applicable to reality.

I also in general agree with most of the comments of Reviewer 2, therefore I will not list similar comments/concerns in this review.

### **Specific Comments:**

L 28: Suggest replacing “a future climate” with “future” as a future climate is not the only important factor.

#### **Response:**

Thanks for your suggestion, we modified this in the revised manuscript (Line 28).

L 66: Please add which version of E-OBS was used.

#### **Response:**

Thanks for your suggestion, the E-OBS version is version 25.0e and we added this information to the revised manuscript (Line 66).

L 70-71: Please specify what percentage “most” refers to and what quantifies as “low” station density. Suggest also showing in the appendix area and stations that have been excluded from the analysis.

#### **Response:**

Thank you for your suggestion, we agree that this sentence lacks precision. Hence, we revised this statement into: “*A spatial mask is further applied to exclude catchments with headwater/contributing areas outside the Europe/E-OBS domain (Lehner et al., 2008)*” (Lines 72 - 73).

L 82: Please specify what method was used to downscale the resolutions.

#### **Response:**

Apologies for the confusion. We aggregated (not downscaled) the population data by summing up the population at a 2.5 arc-minute resolution within each 0.125° grid cell. We clarified this in the revised manuscript (Lines 83-84).

L 105: Please elaborate with a short sentence, why 0.4.

#### **Response:**

We have conducted sensitivity tests with the overlap ratio ranging from 0.3 to 0.5 and found that our results are not sensitive to the value of the overlap ratio. We have added this information to the revised manuscript (Line 108).

L 112: Please elaborate why 1000 km<sup>2</sup>.

#### **Response:**

This choice is motivated by the fact that the mHM resolution is 0.125° × 0.125°, approximately corresponding to an area of 100 km<sup>2</sup>. We aim to ensure that each large river grid cell has at

least 10 upstream cells to facilitate the river routing procedure. Moreover, since our focus is on the climate effect on flood generation, we prioritize grid cells with larger catchment areas. In the future, if mHM has a finer resolution, we may also consider focusing on river grids with lower contributing catchment areas.

L 122: Please elaborate why 0.7.

**Response:**

This ratio was taken from Tarasova et al., (2023), who also applied this ratio to identify the snowmelt-driven floods. We have conducted sensitivity tests with this ratio ranging from 0.6 to 1, and found that our results are not sensitive to the value of this ratio. We have added this information to the revised manuscript (Lines 124-125).

L142: suggest replacing “well” with “satisfactory”, as this is the terminology mainly used associated to the use of NSE values.

**Response:**

Thanks for your suggestion, we revised this in the new manuscript (Line 155).

L360: I’m not sure if one can conclude that “floods are more widespread in low-lying regions, such as parts than in high mountainous regions like the Alps.” As the authors have a priori excluded smaller catchments which would naturally be found in the mountainous areas...

**Response:**

As illustrated in Lines 112-114, we intended to exclude non-riverine floods, but not necessarily small-catchment floods. As depicted in Figure 4, the number of flood events in the high-mountainous region is slightly lower; nevertheless, there are still a number of events to support the conclusion.

Figures: In some Figures red and green colour coding is used. Please avoid using this as it is difficult for colour blind readers to discern the Figures. Suggest using “colour-blind safe” colours instead.

**Response:**

Thanks for your suggestion. We modified the corresponding figures with “colour-blind safe” colors in the manuscript.

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