RC #1

General Comments:

The paper presents a multicriterion assessment framework for flood events forecasting or warning in semi-arid regions. Four hydrologic models have been used in catchments of the middle Yellow River. The result shows that the VMM model has a better performance of flood modeling than the other three models. The authors believe that flood events in semi-arid and arid regions should have different criteria than that of in humid areas to determine whether a flood forecasting and early warning is acceptable.

The topic of this study is very interesting and the idea is more or less novel. The paper is well-structured. I recommend the publication of this paper with a minor revision. Some specific comments are listed as below.

Answer: Thank you for the positive comments on our manuscript.

Specific comments:

(1) The proposed framework has three parts, C1, C2 and C3. C2 is the key part of this framework, and three flow zone (low flow zone, medium flow zone, high flow zone) are divided. I think this simple framework is more important in terms of flood early warning rather than just a performance assessment. This may be real value of the framework but it is not clearly expressed in the manuscript. More explanation and discussion should be added in the paper.

Answer: Thank you for this suggestion. We have added explanations and discussions to the manuscript, especially in Section 4, Results and discussion.

(2) The initial condition is very important for a hydrologic model. In this paper, it is reasonable that the daily based model is used to calculate the initial conditions of the event-based model, but the initial condition of daily based model is not mentioned. Please add some explanations.

Answer: Thank you for this good suggestion. We have rewritten the paragraph and added more detailed information about the initial condition. The revised paragraph is as follows:

"The initial condition has important effects in modeling flood events. The VMM model was run continuously from 1983 to 2009 for each catchment. Two initial values are the initial tension water storage (W0) and the initial free water storage (S0) should be determined. Both of them represent the moisture content of the soil and were assumed to be zero due to the dry conditions at 00:00:00 on January 1, 1983. Rainfall data were available only at an hourly time step over the periods of flood events, and for other periods, they were available at a daily time step. Hence, the time step of simulation was daily between flood events and hourly within flood events."

(3) Conclusion (2): "In the four catchments, by PAWN analysis of VMM, CS, IM, and KE are the most sensitive parameters and are not affected by the choice of objective functions, whereas WM is the most sensitive parameter" make me confusing. Please use clearer and more concise expressions.

Answer: We have rewritten the sentence for clarity.

"In the four catchments, the parameters confluence coefficient of surface flow (CS), impermeable area (IM), and residence time of Muskingum (KE) are the most sensitive based on an analysis by the global sensitivity method PAWN; in addition, the sensitivity ranking of the parameter WM

related with the soil moisture capacity is the most affected by the objective functions."

(4) Reference/citation style needs to be revised. For example, a space is missing between Lu and et on p5, line 26; parenthesis is not right on p7, line 4, (Pianosi and Wagener,2015).
Answer: We have corrected this information.

(5) P3, line13:" Streamflow and rainfall data are from 1983 to 2009. Hourly streamflow data came from hydrological stations. Nine. . .", in this sentence, English tenses should be consistent.
Answer: Thank you for this good suggestion. We have changed this text.

(6) P3, line 26: the runoff is conceptualized as being composed of surface runoff and groundwater flow (notoriously but erroneously called "below-ground off" in the paper).
Answer: Thank you for this good suggestion. We have corrected this text.

(7) Figure 1 is requested to be further processed. The symbols of rain gauge station and hydrological station are not very clear.
Answer: We have improved the figure for clarity.

(8) Figure 3: the y-axis label may be "absolute relative error of peak flow (%)" instead of "peak flow (%)". The title "Figure 3: Boxplot of peak flows . . ." should be also checked.
Answer: We have corrected the label and checked the figure caption.

(9) Although I am not a native English reviewer, I find some sentences difficult to understand. The authors are encouraged to further polish up the language.
Answer: Thank you for this good suggestion. The manuscript has been polished by a professional service. All amendments are shown with tracked changes in the attached pdf file.

RC #2

I think you performed a lot work whose results deserve to be published. The topic addressed in your manuscript is interesting and I think that not only statistical hydrologists will benefit from its publication, either from the decision-makers point of view as well as from the perspective of semiarid catchments. However, I noticed several instances in your manuscript that force me not to accept it for publication in its current state. First, I would like to emphasize that all my detailed comments are included in the attached PDF file. Please, kindly see this attached file at the same scale, so you could find the places which my comments point to properly.

The paper is well structured, but a large number of style corrections is required.

Answer: We thank the reviewer for the positive comments on our manuscript. Detailed style corrections are attached in the supplement.

General Comments:

The discussion of the results is not clear and, in my opinion, could be extended due to the huge effort made in the study. The authors are encouraged to extend the discussion of the results obtained by the explanation of possible causes of differences among hydrological models.

Answer: Thank you for these constructive suggestions. We have added more explanation for clarity.

The initial condition is essential for this type of simulations. Thus, the authors should explain better this section.

Answer: Thank you for this good suggestion. We have written the paragraph and added some detailed information as follows:

"The initial condition has important effects in modeling flood events. The VMM model was run continuously from 1983 to 2009 for each catchment. Two initial values are the initial tension water storage ($W0$) and the initial free water storage ($S0$) should be determined. Both of them represent the moisture content of the soil and were assumed to be zero due to the dry conditions at 00:00:00 on January 1, 1983. Rainfall data were available only at an hourly time step over the periods of flood events, and for other periods, they were available at a daily time step. Hence, the time step of simulation was daily between flood events and hourly within flood events."

Regarding the references shown in the manuscript, some are not listed in the reference list, and also there are some errors in the reference list. Please, check the standards of the journal and correct them.

Answer: We have checked all references and corrected the errors.

I strongly recommend to undertake some check of the language (e.g. by some professional service offered directly by Springer on you websites). Without a doubt, there are some places in the text that are hardly understandable due to the language.

Answer: Thank you for this good suggestion. The manuscript has been edited for language by a professional editing service. All amendments are shown with track changes in the attached pdf file

I believe my comments will help you improve your MS, which will lead to is final publication.

Answer: Thank you. Your comments greatly helped us improve the manuscript, which we hope is now suitable for publication.

Specific comments:

Page 1

Line 10-12: It may be rewritten, although the sentence is understood, I think it is not the best way. Try to avoid double parentheses. Besides, the manuscript is focused on VMM, so this model should be first. E.g.: 'The ⋯ (VMM) is compared with three models, one physical based model, the MIKE SHE, and two conceptual models, the XAJ and the Shanbei' (this is just a suggestion, feel free to write your way).

Answer: We accept the reviewer's suggestion.

Change: The vertically mixed runoff model (VMM) is compared with three models, one physical-based model, MIKE SHE, and two conceptual models, the Xinanjiang model (XAJ) and Shanbei model (SBM).

Line 16: "its figure is only 41% in four semiarid catchments", could you explain better this sentence？

Answer: We apologize for our unclear expression, which has been revised.

Change: Our results show that the VMM has a better flood estimation performance than the other models, and under the multicriteria assessment framework, the average acceptance of flood events is improved. In addition, the framework can provide reasonable flood early warning information for decision-makers.

Line 24: "and", but

Answer: This change has been made.

Change: but

Page 2

Line 9-10: Maybe it is better "to be used on a large-scale semiarid area".

Answer: Thank you for this good suggestion. We have changed this phrasing.

Change: The radar costs are too high to be used on a large-scale semiarid area.

Line 14: "severe", what is the meaning of severe here? It should be better explained.

Answer: "Severe rainstorms" means the rainstorms have produced the largest peak flows according to Michaud and Sorooshian (1994). We have added more explanation.

Change: Michaud and Sorooshian (1994) used 24 severe rainstorms that produced the largest peak flows during 1957-1977 to compare three hydrologic models, i.e., the lumped SCS model, simple distributed SCS model and distributed KINEROS model, in the Walnut Gulch catchment.

Line 20-21: "Therefore, it is urgent to search for useful information based on the limited accuracy of modeling results to serve as flood warnings and to improve decision making.". I do not understand this sentence. Please, rewrite the sentence.

Answer: We apologize for the unclear phrasing. We have rewritten the sentence.

Change: Therefore, determining how to use modeling results with limited accuracy to provide

guidance for flood early warning is important.

Line 24-25: "Four hydrologic models (the vertically mixed runoff model (VMM), MIKE SHE, Xinanjiang Model (XAJ) and Shanbei model (SBM)) ...". To much parenthesis; Try to make a continuous sentence: "Four hydrological models: the vertical ⋯, the MIKE SHE model, ⋯, are compared ...
Answer: Thank you for this suggestion. We have rewritten the sentence.
Change: Four hydrological models: the vertically mixed runoff model (VMM), the MIKE SHE model, Xinanjiang model (XAJ) and Shanbei model (SBM), are compared on the….

Line 27: "remainder". Please, use another word.
Answer: We have rewritten the sentence.
Change: The rest of the paper is organized as follows.

Line 27: "section below". Specify to which section corresponds exactly, so it is necessary to use capital letters: e.g. "The Methodology Section", or use instead of the name, just the number of the section "Section 3 describes⋯".
Answer: This is a good suggestion. We have changed this phrasing.
Change: Section 2 describes the study area and the data set used.

Line 28-31: "The VMM model...of the study.". Please rewrite the whole paragraph, it is difficult to follow it.
Answer: We have rewritten the paragraph to clarify our intent.
Change: Section 3 presents the VMM model methodology, initial condition set, model calibration and validation, multicriteria assessment framework and parameter sensitivity analysis. Section 4 describes the results and discussion of model comparison, sensitivity analysis and analysis of the multicriteria assessment framework for the VMM model. The final section presents the conclusions of the study.

Page 3
Line 1: Is there any reference for all these data? I mean the temperature, rainfall and seasonality of the rainfall data.
Answer: The temperature data are obtained from previous papers, and we have added references. In addition, all rainfall data are collected from rain gauging stations, and we have added an explanation.
Change: This change has been made.

Line 3: "is", between.
Answer: This change has been made.
Change: between.

Line 4:" is", between.
Answer: This change has been made.
Change: between.

Line4: "65 – 80%", more less the 65 to 80%.
Answer: This change has been made.
Change: more less the 65 to 80%.

Line 5: "is", between.
Answer: This change has been made.
Change: between

Line 8: "soil erosion", how much?
Answer: Thank you for this good question. According to Li et al. (2019), the average sediment concentration reaches 126 kg m^{-3} in these regions. We have added this information to the text.
Change: The lack of vegetation in these catchments leads to serious soil erosion, and the average sediment concentration reaches 126 kg m^{-3} according to Li et al. (2019).

Line 9: "few attempts have been applied to model hourly flood flows". Please rewrite the sentence. It has poor writing.
Answer: We apologize for the poor phrasing. We have rewritten this sentence.
Change: Only a few studies have modeled hourly floods.

Line 11: "Hence, modeling floods and providing a useful method for decision makers in charge of flood defense are essential and urgent.". Please rewrite the whole sentence, I cannot follow it.
Answer: We apologize for the poor phrasing. We have rewritten this sentence.
Change: Hence, it is important for decision-makers to know how to evaluate the flood risk when a flood is approaching.

Line 12: "Streamflow and rainfall data are from 1983 to 2009." Please rewrite the sentence. It has poor writing.
Answer: We apologize for the poor phrasing. We have rewritten this sentence.
Change: The period used in the modeling is from 1983 to 2009. Streamflow and rainfall data are collected from streamflow gauging stations and rain gauging stations at an hourly time-step.

Line 12: "stations", which type of stations?
Answer: They are streamflow gauging stations. We have corrected this phrasing.
Change: Streamflow and rainfall data are collected from streamflow gauging stations and rain gauging stations at an hourly time-step, respectively.

Line 14-15: Thiessen polygon method was...
Answer: This change has been made.
Change: Thiessen polygon method was used to interpolate the rainfall data for each catchment.

Line 15: "...interpolate the rainfall data.". For each basin? I guess.
Answer: We agree with the reviewer. We have added this information.

Change: Thiessen polygon method was used to interpolate the rainfall data for each catchment.

Line 17: Here you should characterize the model in its whole, I mean, explain here also that it is lumped, continuous or event based, and so on.

Answer: Thank you for this suggestion. We have added this information.

Change: The VMM is a lumped continuous hydrologic model developed by Bao and Wang (1997).

Line 18: "...conceptual hydrologic model...", is continuous or event based?

Answer: It a continuous model; we have added this information.

Change: The VMM is a lumped continuous hydrologic model and has been used in many areas in China, especially in semiarid and subhumid catchments.

Line 21: "etc", better "and others".

Answer: Thank you for raising this good point. We have corrected this phrasing.

Change: This change has been made.

Page 4

Line 24: "in", at.

Answer: This change has been made.

Change: at.

Line 25-27: "Hence, tension water storage W... on daily values of W and S". Please, explain it better, because I do not understand what type of variables you used in the case you just simulate a flood event.

Answer: We are apologized for our unclear phrasing. We have rewritten this paragraph.

Change: The initial condition has important effects in modeling flood events. The VMM model was run continuously from 1983 to 2009 for each catchment. Two initial values are the initial tension water storage ($W0$) and the initial free water storage ($S0$) should be determined. Both of them represent the moisture content of the soil and were assumed to be zero due to the dry conditions at 00:00:00 on January 1, 1983. Rainfall data were available only at an hourly time step over the periods of flood events, and for other periods, they were available at a daily time step. Hence, the time step of simulation was daily between flood events and hourly within flood events.

Page 5

Line 1: "Because...". The sentence has poor writing. Maybe you it is better to write "Due to the fact that only ⋯ ". But I recommend rewriting the sentence.

Answer: Thank you for this good suggestion. We have rewritten the sentence.

Change: Due to the fact that only one streamflow gauging station is available for each catchment, the spatial variation in each catchment's parameters cannot be determined by calibration.

Line 1: "gauge", gauging.

Answer: This change has been made.

Change: gauging

Line 4: "Li et al., 2018", 2018a or 2018b?

Answer: We have checked the reference.

Change: Li et al., 2018

Line 8: "…full fitness…". I guess you mean "fullfillnes", but I think you should better rewrite the whole sentence in order to get a continuity in the writing.

Answer: Thank you for raising this good point. We have rewritten this sentence.

Change: however, it may not be suitable for semiarid catchments because a good fit is not required between the simulated and observed streamflows.

Line 9: "(McIntyre and Al-Qurashi, 2009: SHARMA and MURTHY, 1998)". Remove parenthesis, write it properly. "McIntyre and Al-Qurashi (2008) and Sharma and Murphy (1998) used ···".

Answer: This change has been made.

Change: McIntyre and Al-Qurashi (2009) and Sharma and Murphy (1998) used…

Line 12: "$Q_{p\prime}^{i}$". It is difficult to distinguish the apostrophe. Please, try another mark in order to make out the different variables

Answer: Thank you for this suggestion. We have changed this phrasing.

Change: Q_{pm}^{i}.

Line 13: The same as previous.

Answer: Thank you for this suggestion. We have changed this phrasing.

Change: Q_{vm}^{i}.

Line 15: Please, try another mark in order to make out the different variables.

Answer: This change has been made.

Change: Q_{pm}.

Line 16: The same as previous.

Answer: This change has been made.

Change: Q_{vm}

Line 20: "We…". It is up to you, but you should try to get coherence throughout the text. Consider using the impersonal form, as you have done in the rest of the manuscript.

Answer: Thank you for raising this good point. We have rewritten the sentence.

Change: The number of iterations was set to 2000 in the calibration process.

Line 21: "…step". Please, use another Word, as step can be misunderstood by iteration.

Answer: Thank you for raising this good point. We have changed this phrasing.

Change: The number of iterations was set to 2000 in the calibration process.

Line 26: "Wei-jian et al., 2016". It is not in the reference list.

Answer: We apologize. We have replaced it with another paper due to the reference being in Chinese.

Change: Cheng, C. T., Zhao, M. Y., Chau, K., and Wu, X. Y.: Using genetic algorithm and TOPSIS for Xinanjiang model calibration with a single procedure, J. Hydrol., 316, 129-140, 2006.

Line 26-27: "We test the performance... the middle Yellow River." This sentence is relevant? I mean, you should restructure the whole paragraph in order to get coherence, instead of specifying one by one each model.

Answer: Thank you for this good suggestion. We have made some changes.

Change: Please refer to the revised version of the manuscript.

Line 27: "Zhao (1983)". It is not in the reference list.

Answer: We have added this information.

Change: Zhao, R.: Watershed Hydrological Model: Xinanjiang Model and Shanbei Model, Water and Power Press, Beijing, China, 1983.

Line 28: "(Bao et al., 2017)". Could you provide more references?

Answer: We have added some references.

Change:

Li, Z. J., and Zhang, K.: Comparison of three GIS-based hydrological models, J. Hydrol. Eng., 13, 364-370, 2008.

Zhao, L., Xia, J., Xu, C. Y., Wang, Z., Sobkowiak, L., and Long, C.: Evapotranspiration estimation methods in hydrological models, J. Geogr. Sci., 23, 359-369, 10.1007/s11442-013-1015-9, 2013.

Line 28: "MIKE SHE...". Could you provide more characteristics of the model?

Answer: We have added more characteristics of the model.

Change: MIKE SHE originated from the Système Hydrologique Européen (SHE) program, and it is a deterministic, physically based distributed hydrologic model that can simulate surface water flow, unsaturated flow and saturated flow (Jayatilaka et al., 1998). MIKE SHE has been used to solve water resources and environment problems at different spatiotemporal scales (Li et al., 2018; Rujner et al.,2018; Samaras et al., 2016).

Page 6

line 3: There are many grammatical errors. Please, revise the whole point.

Answer: Thank you for pointing out these errors. We have corrected them.

Change: Please refer to the revised version of manuscript.

Line 3: "...of...". "for" instead of "of"?

Answer: This change has been made.

Change: for.

Line 4: "...characterizes...", characteristics.

Answer: This change has been made.

Change: characteristics.

Line 4: "and lack of enough rain gauges,", and also dispersion.

Answer: This change has been made.

Change: and also dispersion.

Line 5: "flood simulation", flood simulations.

Answer: This change has been made.

Change: flood simulations.

Line 6: "...to...", for.

Answer: This change has been made.

Change: for.

Line 7: "...flood feature...". I would remove "flood" as It is obvious.

Answer: This change has been made.

Change: This change has been made.

Line 9: "calculation...". I would remove this.

Answer: This change has been made.

Change: This word has been removed.

Line 11: "...and Bayesian method...". Which one? could you give some more information?

Answer: We have added this information.

Change: and Bayesian method with Markov chain Monte Carlo sampling.

Line 12: " but the way may...". I do not understand that phrase.

Answer: We have improved the sentence.

Change: although these methods may not lead to clear decisions.

Line 13: "...acquire...". Consider to change the Word.

Answer: This change has been made.

Change: obtain.

Line 13: "...utility...", useful.

Answer: This change has been made.

Change: useful.

Line 14: "...Yellow Rivers.". Please be careful. Remove "s".

Answer: This change has been made.

Change: ...Yellow River.

Line 16: "modeling...", modeled.

Answer: This change has been made.

Change: modeled

Line 16: "peak flows". Remove "s".

Answer: This change has been made.
Change: peak flow.

Line 21: "modeling…", modeled.
Answer: This change has been made.
Change: modeled.

Line 22: "(detailed …)". I would not use the parenthesis here. Just use the semicolon.
Answer: Thank you for this good suggestion. We have improved the sentence.
Change: one component of the Bayesian forecasting system is detailed in Krzysztofowicz (1999) and Biondi et al. (2010).

Line 23: "(Krzysztofowicz, 1999; Biondi et al., 2010)". Remove parenthesis and write them in a correct way.
Answer: Thank you for noting these errors. We have corrected this phrasing.
Change: ···Krzysztofowicz (1999) and Biondi et al. (2010).
Line 25: "modelling peak flow…", the modelling peak.
Answer: This change has been made.
Change: the modelling peak.

Page 7
Line 4: "(Pianosi and Wagener, 2015)". Please write the parenthesis in the correct way. "pianosi and Wagener (2015) proposed ···".
Answer: Thank you for pointing out these errors. We have corrected this phrasing.
Change: Pianosi and Wagener (2015)

line 4: "PAWN", What is the meaning?. Explain the method.
Answer: PAWN is derived from the authors names according to Pianosi and Wagener (2015). We have added more explanation.
Change: Pianosi and Wagener (2015) proposed the novel GSA method PAWN (derived from the authors' names) based on the cumulative density function.

Line 5-6: "(Khorashadi Zadeh et al., 2017)". Please, write the reference in the correct way.
Answer: We have corrected this phrasing.
Change: Khorashadi et al. (2017)

Line 21: "5 events…". "five" instead of 5. Correct the rest of remaining ones throughout the paragraph.
Answer: We have corrected them.
Change: Five
Line 27: Results Section is good, but you have to rewrite it better, and expand it. Please, try to be more clear, and specify every result you have.
Answer: Thank you for these suggestions. We have rewritten Section 4.1.
Change: Please refer to the revised version of the manuscript.

Page 8

Line 1: "...VMM performs better...". In both calibration and validation? Please, expand your explanation.

Answer: We apologize for our unclear expression. We have rewritten the sentence.

Change: In terms of the median and average of the absolute relative errors for peak flows, except for the validation period in the Kuye River catchment shown in Figure 3 (h), Figures 3 (a)–(g) reveal that the VMM has lowest values for both calibration and validation.

Line 2: "...for both median and average peak flows." I understand what you are saying, but try to work out your explanation.

Answer: We have rewritten the sentence.

Change: In terms of the median and average of the absolute relative errors for peak flows, except for the validation period in the Kuye River catchment shown in Figure 3 (h), Figures 3 (a)–(g) reveal that the VMM has lowest values for both calibration and validation.

Line 11: "Overall...". Remove that. Rewrite the sentence.

Answer: We have rewritten the sentence.

Change: The analysis of Figure 3, Table 3 and Table 4 shows that the VMM has the best performance for flood modeling in the four studied catchments of the middle Yellow River.···

Line 11-12: "in the middle Yellow River". " of the" instead of "in".

Answer: This change has been made.

Change: of the

Line 12: "MIKE SHE...". There is a lack of connectors in some parts of the text. Here, you should use: "Besides", "In addition", etc.

Answer: This change has been made.

Change: In addition

Line 21: "Eq.(9) and Eq.(11)". Substitute the Equation by the variable, or write both of them. "Ep (Eq. 9) and Epv (Eq. 11)".

Answer: Thank you for this good suggestion. We have rewritten them.

Change: E_p(Eq. 9) and E_{pv}(Eq. 11).

Line 21-22: "The most sensitive ...objective functions.". Try to explain better what you want to mean. Rewrite the sentence.

Answer: We have rewritten the sentence.

Change: The higher the ranking is, the more sensitive the parameters. We can find that the parameters *CS*, *IM* and *KE* have the highest rankings whether the objective function of the VMM model is E_p or E_{pv}.

Line 29: "...must meet...". There are two "must" in the sentence. Please, use synonym or rewrite the sentence.

Answer: We have rewritten the sentence.

Change: The framework requires that an accepted flood event should meet one of the requirements of C1 and C2; in addition, C3 needs to be satisfied simultaneously.

Line 30: "Flood events conforming to conditions...". Is that right?

Answer: We apologize for the unclear expression. We have rewritten the sentence.

Change: The observed peak flows and the modeled peak flows under the conditions C1, C2 or C3 are shown in Figure 5.

Page 9

Line 15: "...VMM...". In the conclusions part, you should rewrite the abbreviations. Please, check the rest of references and abbreviations.

Answer: We have checked them and added an explanation for clarification.

Change: Please refer to the revised version of the manuscript.

Line 19-20: "In the four catchments, by...sensitive parameter.". The same as previous.

Answer: We have rewritten the sentence.

Change: In the four catchments, the parameters confluence coefficient of surface flow (*CS*), impermeable area (*IM*), and residence time of Muskingum (*KE*) are the most sensitive based on an analysis by the global sensitivity method PAWN; in addition, the sensitivity ranking of the parameter *WM* related with the soil moisture capacity is the most affected by the objective functions.

Line 23: "The condition C2... ". Explain that. You should bear in mind Conclusions could be read by anyone, so they should not contain references to the rest of the article unless it is completely necessary.

Answer: We have added more explanation.

Change: The condition C2, which divides peak flows into three flow zones, will be affected...

Line 24: "... enrich...". Please, use another word.

Answer: This change has been made.

Change: The framework… can provide guidance for decision making.

Page 10

Line 5: "Reference:". There are several errors in the reference list. Please, read the journal's rules, and correct every mistake. I just write down some of them. Besides, order the references according to the standards of the journal.

Answer: We have checked the references and corrected them.

Change: Please refer to the revised version of the manuscript.

Line 6: "Andersen....". This is a PhD Thesis. Please, read journal's rules.

Answer: This change has been made.

Change: Andersen, F. H.: Hydrological modeling in a semi-arid area using remote sensing data, Ph.D. thesis, University of Copenhagen, Copenhagen, Denmark, 2008.

Line 8-9: "Burnash...". I found the paper, but there is a lack of information here. Please complete the reference.
Answer: This change has been made.
Change: Burnash, R. J., Ferral, R. L., and McGuire, R. A.: A generalized streamflow simulation system, conceptual modeling for digital computers, Report by the Joliet Federal State River Forecasts Center, Sacramento, CA, 204 pp., 1973.

Line 11-12: "Bao, W. and Wang, C....". Unless, it is completely necessary, please, try to avoid references that are hard to find out. I could not find those references in Chinese.
Answer: Thank you. We believe that this suggestion is very constructive. We have replaced this reference with another paper. However, some references in Chinese are completely necessary, so we have kept them.
Change: Wang, G., and Ren, L.: A Contrastive Study of Simulation Results between GWSC-VMR and Hybrid Runoff Model in Dianzi Basin, in: International Conference on Environmental Science and Information Application Technology, Wuhan, China, 4 – 5 July, 583-588, 2009.

Line 22: "Beven, K.:...". It is needed more info about these references.
Answer: This change has been made.
Change: Beven, K. J.: Environmental modelling: An uncertain future?, CRC press, London, UK, 328 pp., 2007

Line 23: "Beven, K.:...". It is needed more info about these references.
Answer: This change has been made.
Change: Beven, K. J.: Rainfall-runoff modelling: the primer, John Wiley & Sons, UK, 488 pp., 2011

Page 11
line 4: "3-23, 2007." DOI?
Answer: This change has been made.
Change: Collier, C. G.: Flash flood forecasting: What are the limits of predictability?, Q. J. Roy. Meteor. Soc., 133(622), 3 – 23, https://doi.org/10.1002/qj.29, 2007

Line 31-32: "Li, D: ...". Rewrite according to the journal's rules.
Answer: This change has been made.
Change: Li, D.: Hydrologic model: the vertically mixed runoff model (vmm), HydroShare, https://doi.org/10.4211/hs.c523228 7d5c04bfb8cac5ce4e391ea 0f, 2018

Page 12
Line 2: "...Qiushui River, Yellow River, 06, 24-28, 2018a.". This is a journal?? Please, again try to avoid these references, but also try to make easy to find them in case you want to add them to the list.
Answer: We have deleted it.

Change: The reference has been deleted.

Line 29: "1-32". Pages range is wrong.
Answer: Thank you for noting these errors. We have corrected this phrasing.
Change: Sharma, K. D., and Murthy, J. S. R.: A practical approach to rainfall-runoff modelling in arid zone drainage basins, Hydrolog. Sci. J., 43(3), 331 – 348, 1998

Line 32: "United Nations Environment...". More information about the Book.
Answer: This change has been made.
Change: United Nations Environment Programme (UNEP): World Atlas of Desertification, Edward Arnold, London, 69 pp., 1992

Page 13
Line 3: "...Yellow River.". The same as previous.
Answer: This change has been made.
Change: Please refer to the revised manuscript.

Line 8: "Mathematical modelling and computational experiments.", abbreviation?
Answer: This change has been made.
Change: Sobol, I. M.: Sensitivity estimates for nonlinear mathematical models, Math. Model. Comput. Exp., 1, 407 – 414, 1993.

Line 13: "44(5), 2008.", pages range?
Answer: We have added this information.
Change: Yatheendradas, S., Wagener, T., Gupta, H., Unkrich, C., Goodrich, D., Schaffner, M. and Stewart, A.: Understanding uncertainty in distributed flash flood forecasting for semiarid regions, Water Resour. Res., 44(5), 61 – 74, 2008.

Line 15: "J.GEOPHYS. RES-ATMOS.". Why in capital letters?
Answer: Thank you for noting these errors. We have corrected this phrasing.
Change: Young, C.B., Nelson, B.R., Bradley, A.A., Smith, J.A., Peters-Lidard, C.D., Kruger, A. and Baeck, M.L.: An evaluation of NEXRAD precipitation estimates in complex terrain, J. Geophys. Res.-Atmos., 104, 19691 – 19703, 1999.

Page 18
Figure 1: What is the meaning of the big R? Please, include other references in the map of the Yellow River Basin, maybe the border of the see or the cities included inside the basin. Also, the rain gaunges stations are not clear. Please, change the mark. Finally, the drainage basin is too gross. Please, try to add some more detail.
Answer: Thank you for these suggestions. The big R may be a display error. It should be the North Arrow. In addition, we have checked all figures in case other errors occurred. We have improved Figure 1 for clarity.
Change:
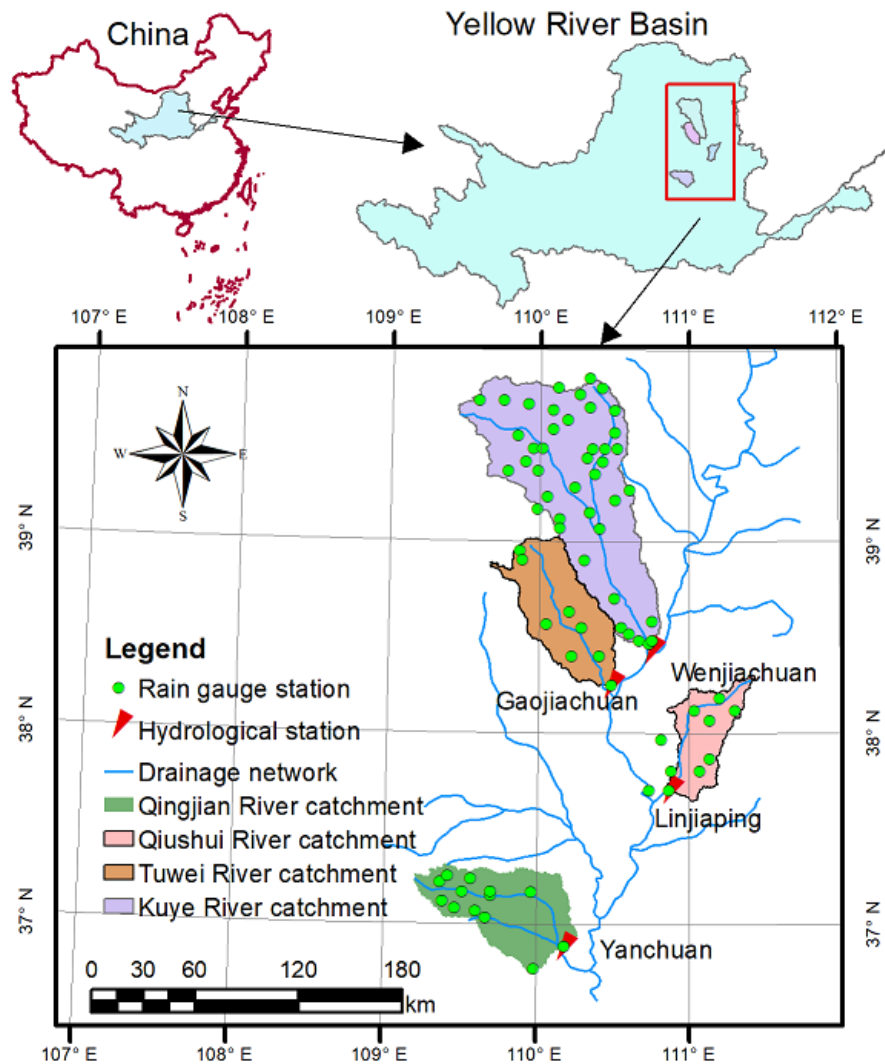
Figure 1: Location of the Qingjian River catchment, Qiushui River catchment, Tuwei River catchment and Kuye River catchment.

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Figure 3: Please, add letters to identify each graph, in order to be able to talk about them in the manuscript. Also, you should add some space among graphs. Regarding the axes, specify clearly what is the variable they are measuring, I guess they talk about errors.

Answer: Thank you for these suggestions. We have improved Figure 3. In addition, the Y axis label should be "Absolute relative errors of peak flows (%)". We have corrected this phrasing.

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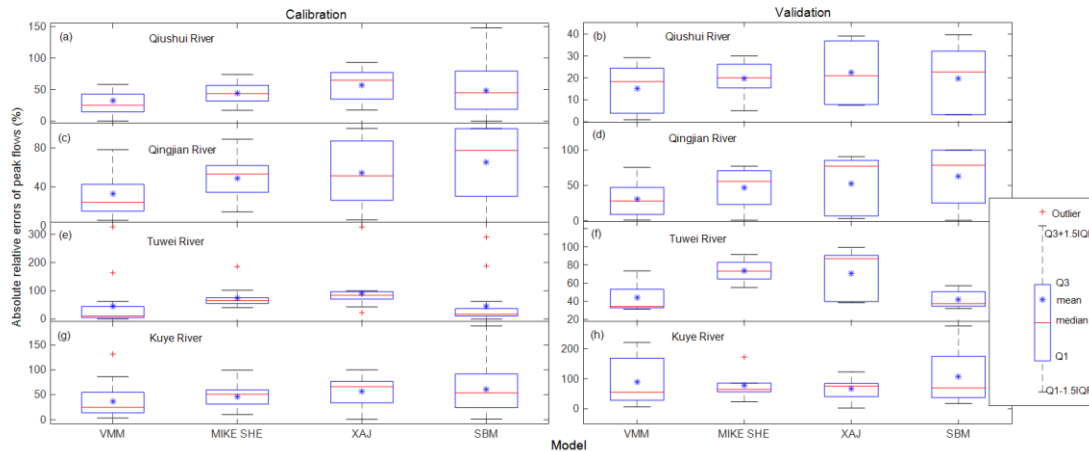
Figure 3: Boxplots of the absolute relative errors of the peak flows in the four catchments; Q1 and Q3 mean the first quantile and third quantile, respectively; interquartile range (IQR)= Q3 − Q1; and an outlier is defined as an extreme value that exceeds the IQR.

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Figure 4: Please, rewrite the whole figure caption. It is very difficult to understand what you try to say.

Answer: We apologize for the lack of clarity. We have rewritten the figure caption.

Change: Figure 4: Sensitivity rankings of the VMM parameters based on the global sensitivity analysis method PAWN for different objective functions: (a) E_{pv} as the objective function, and (b) E_p as the objective function. The value P is used to assess the sensitivity degree of the parameter with PAWN method, and a larger value corresponds to greater sensitivity. The numbers on the ordinate represent the sensitivity rankings.

Page 22

figure 5: Please, add letters at each graph, in order to be able to talk about them in the text. In addition, clarify the legend, it is difficult to identify each variable. Regarding the caption, please give more info, more detail about the graph. Explain more about we are watching.

Answer: Thank you for this good suggestion. We have added letters at each graph and additional explanations in the figure caption. In addition, additional explanations have been added to Section 4.3.

Change:
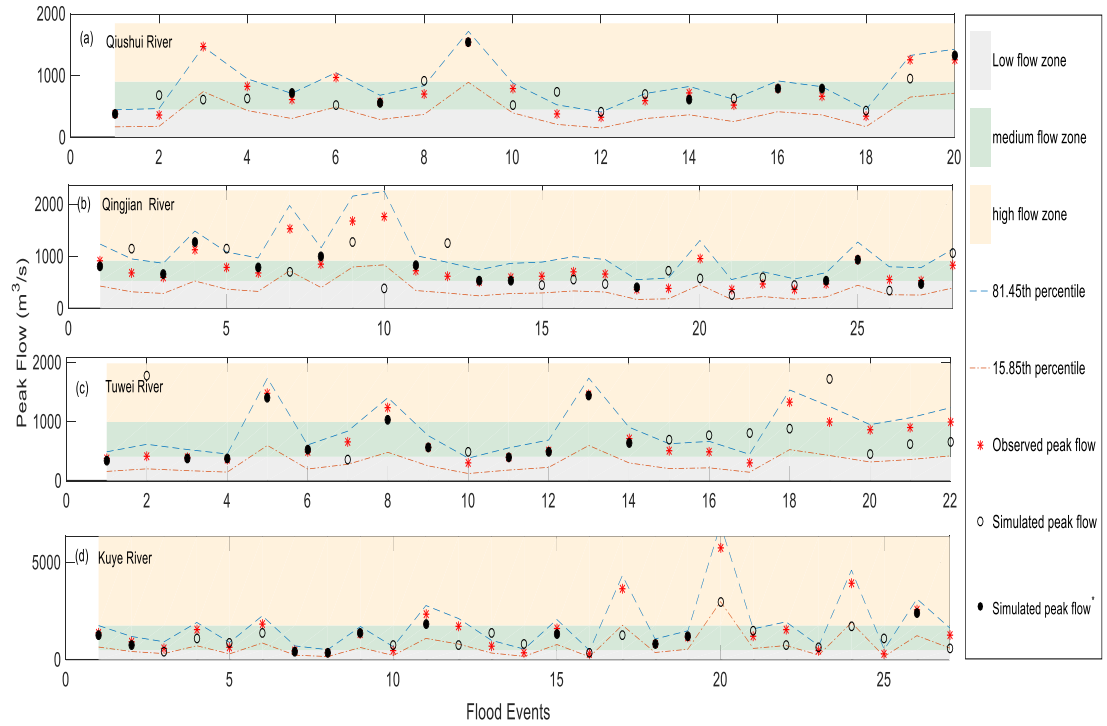
Figure 5: Observed peak flows (red asterisk) and simulated peak flows (solid ball and circle) with the VMM for each catchment under the conditions C1, C2 and C3. Flood peaks conforming to the condition C1 is represented by a solid ball; the three flow zones (low, medium and high flow zones) divided by the condition C2 are shown in gray, green and off-white, respectively; 68.3% confidence interval of peak flows estimated by the condition C3 is between the blue dashed line (81.45th percentile) and the red dash-dotted line (15.85th percentile).

Multicriteria assessment framework of flood events simulated with the vertically mixed runoff model in semiarid catchments in the middle Yellow River

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Abstract. Flood forecasting and simulation in semiarid regions are always poor, and a single criterion assessment provides limited information for decision making. Here, we propose a multicriteria assessment framework that combines the absolute relative error, flow partitioning and confidence interval estimated by the Hydrologic Uncertainty Processor (HUP) to assess the most striking feature of an event-based flood: the peak flow. The vertically mixed runoff model (VMM) is compared with three models, one physical-based model, the MIKE SHE and two conceptual models, the Xinanjiang model (XAJ) and the Shanbei model (SBM). The 100 flood events in the four catchments of the Yellow River are modeled over the period of 1983–2009. Our results show that the VMM has a better flood estimation performance than the other models, and under the multicriteria assessment framework, the average acceptance of flood events is improved. In addition, the framework can provide reasonable flood early warning information for decision-makers.

1 Introduction

Arid and semiarid regions account for approximately one-third of the global land surface and half of China. A trend towards a warmer climate has increased the global incidence of intense precipitation events. Arid and semiarid regions, i.e., areas where the annual rain is less than 250 and 250–500 mm/a, respectively, are particularly vulnerable to this change in climate (Khomsi et al., 2016; Yatheendradas et al., 2008). More than 50% of flood-related casualties occur in these regions worldwide (Brito and Evers, 2016).

Hydrological models play an important role in flood simulation and forecasting (Devia et al., 2015). Many studies have focused on the improvement and estimation of hydrologic models in humid catchments, although similar work for semiarid catchments is relatively few (Jiang et al., 2015). The runoff generation mechanism of semiarid catchments is complex and may be simultaneously dominated by infiltration excess and saturation excess mechanisms (Beven, 1983; Beven and Freer, 2001).

Modeling semiarid catchments is a difficult task due to the strong spatial variability in rainfall and complexity of

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landscape characteristics (vegetation, soil, etc.) (Pilgrim et al., 1988). Compared with humid catchments, the rainfall of semiarid catchments is characterized by a high intensity and short duration (Andersen, 2008). In certain areas with developing economies and small populations, the network of rain gauges is generally sparse. Rainfall data are important inputs for hydrologic models, and the high temporal-spatial rainfall variability combined with sparse rain gauges makes modeling runoff more difficult (Hao et al., 2018; Li and Huang, 2017; Mwakalila et al., 2001).

Satellite technology has the possibility to solve the issue of low rain gauge densities, although the low spatial and temporal resolutions of the products limit their applicability to subdaily rainstorms (Dinku et al., 2007). Weather radar has high spatial resolution (1 km) and temporal resolution (15 min). However, the radar costs are too high to be used for large-scale semiarid areas (Young et al., 1999).

Literature on the subdaily modeling of rainfall runoff is limited in semiarid catchments. Due to quick times-to-peak and scarce rainfall data, capturing rainstorm flood responses is more difficult than estimating daily, monthly or annual runoff (Andersen, 2008; McMichael et al., 2006). Flood simulation results in semiarid catchments are often poor. Michaud and Sorooshian (1994) used 24 severe rainstorms that produced the largest peak flows from 1957–1977 to compare three hydrologic models, i.e., the lumped SCS model, simple distributed SCS model, and distributed KINEROS model, in the Walnut Gulch catchment, and none of them were able to accurately simulate flood events. McIntyre and Al-Qurashi (2009) analyzed 27 flood events with three hydrologic models (the lumped IHACRES model, distributed IHACRES model, and a 2-parameter regression model) in a catchment in Oman. The average absolute relative errors in the flow peak and flow volume were 53% and 36%, respectively, for the best performing models. Under current technical conditions, it seems difficult to achieve an acceptable simulation/forecasting result for flood events in semiarid catchments. Therefore, determining how to use modeling results with limited accuracy to provide guidance for flood early warning is important.

In this study, a multicriteria assessment framework that combines the absolute relative error, flow zone partitioning, and the confidence interval estimated by Hydrologic Uncertainty Processor (HUP) is proposed to provide information for engineers' decision making. Four hydrological models: the vertically mixed runoff model (VMM), the MIKE SHE model, Xinanjiang model (XAJ) and Shanbei model (SBM), are compared based on the performance of the modeling results in four catchments in the middle Yellow River. The global sensitive analysis (GSA) method PAWN is used to analyze the parametric sensitivity of the VMM. The rest of the paper is organized as follows. Section 2 describes the study area and the data set used. Section 3 presents the VMM model methodology, initial condition set, model calibration and validation, multicriteria assessment framework and parameter sensitivity analysis. Section 4 describes the results and discussion of model comparison, sensitivity analysis and analysis of the multicriteria assessment framework for the VMM model. The final section presents the conclusions of the study.

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2 Study area and data

The 4 selected study catchments are all key tributaries located in the middle Yellow River, China (Fig. 1). The maximum and minimum areas of catchments are 1989 km^2 and 8706 km^2, respectively. The average annual temperature ranges from 6–14℃. The average annual precipitation ranges from 1010–1150 mm, and 65 to 80% is concentrated in summer (Li et al., 2019; Li and Huang, 2017). The rainfall is generally characterized by high intensity and short duration. The average annual evaporation ranges from 1010–1150 mm. All selected catchments are semiarid due to an aridity index between 2.31 and 2.78 (UNEP, 1992). This catchment information is listed in Table 1.

The lack of vegetation in these catchments leads to serious soil erosion, and the average sediment concentration reaches 126 kg m^{-3} according to Li et al. (2019). Some hydrologists have studied daily and monthly rainfall runoff, although few studies have modeled hourly floods. With the rapid increase in population and economic development, flood disasters have received increasing attention. Hence, it is important for decision-makers to know how to evaluate the flood risk when a flood is approaching.

The period used in the modeling is from 1983 to 2009. Continuous streamflow and rainfall data are collected from streamflow gauging stations and rain gauging stations at a daily time step, respectively; streamflow and rainfall data for each of the flood events are collected at an hourly time step. Nine rainfall gauging stations in the Qiushui River catchment, 15 rainfall gauging stations in the Qingjian River catchment, 12 rainfall gauging stations in the Tuwei River and 41 rainfall gauging stations in the Kuye River were selected. Thiessen polygon method was used to interpolate the rainfall data for each catchment.

3 Methodology

3.1 Vertically mixed runoff model

The VMM is a lumped, continuous hydrologic model and has been used in many areas in China, especially in semiarid and subhumid catchments (Bao and Zhao, 2014; Li, 2018; Wang and Ren, 2009). Compared with other conceptual models, such as the XAJ model (Zhao, 1992), Sacramento Soil Moisture Accounting Model (SSMA) (Burnash et al. 1973), among others, the VMM is able to simulate the saturation excess and infiltration excess runoff generation mechanisms simultaneously. As shown in Fig. 2, the VMM combines the infiltration capacity curve and tension water content storage capacity curve in the vertical direction. Net rainfall (observed rainfall after removal of evaporation, PE) is partitioned into surface runoff (RS) and infiltration flow (FA) by the infiltration capacity curve in the VMM. FA is regulated by the tension water storage capacity curve, part of which supplements the tension water storage (W), with the rest forming the groundwater flow (RB) (including unsaturated flow and saturated flow). Here, the calculation of runoff generation is described briefly. More detailed information about the VMM is contained in Bao and Zhao (2014).

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The improved Green-Ampt infiltration curve (Bao, 1993) is applied in the VMM as the infiltration capacity curve, and the equation is as follows:

$$FM = FC\left(1 + K\frac{WM - W}{WM}\right) \qquad (1)$$

where FM is the average point infiltration capacity of the catchment, and the descriptions of WM, K, and FC are shown in Table 2.

FA is calculated by Eq. (2):

$$FA = \begin{cases} FM - FM\left(1 - \frac{PE}{(FMM)^{1+BF}}\right) & PE < FMM \\ FM & PE \geq FMM \end{cases} \qquad (2)$$

where

$$FMM = FM(1 + BF) \qquad (3)$$

in which FMM is the maximum point infiltration capacity of the catchment and BF is shown in Table 2.

The part that exceeds the average point infiltration capacity of the catchment FM forms RS. RS can be calculated by Eq. (4).

$$RS = PE - FA \qquad (4)$$

RB can be calculated by Eq. (5):

$$RB = \begin{cases} FA - WM + W + WM\left(1 - \frac{W^* + FA^{B+1}}{WMM}\right) & FA + W^* < WMM \\ FM - WM + W & FA + W^* \geq WMM \end{cases} \qquad (5)$$

where

$$W^* = WMM\left[1 - \left(1 - \frac{W}{WM}\right)^{\left(\frac{1}{B}+1\right)}\right] \qquad (6)$$

$$WMM = WM(1 + B) \qquad (7)$$

in which WMM is the maximum point tension water storage capacity of the catchment, W^* is the ordinate of Fig. 2 (b), which represents the point tension water content capacity in the catchment, and B is shown in Table 2.

The outlet runoff R can be calculated as follows:

$$R = RS + RB \qquad (8)$$

3.2 Initial condition of the VMM

The initial condition has important effects in modeling flood events. The VMM model was run continuously from 1983 to 2009 for each catchment. Two initial values are the initial tension water storage ($W0$) and the initial free water storage ($S0$) should be determined. Both of them represent the moisture content of the soil and were assumed to be zero due to the dry conditions at 00:00:00 on January 1, 1983. Rainfall data were available only at an hourly time step over the periods of flood

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events, and for other periods, they were available at a daily time step. Hence, the time step of simulation was daily between flood events and hourly within flood events.

3.3 Model calibration

To consider the spatial variation in rainfall, the subcatchments are divided and the VMM model is applied to each subcatchment. Due to the fact that only one streamflow gauging station is available for each catchment, the spatial variation in each catchment's parameters cannot be determined by calibration. Thus, the parameters are set uniformly in all subcatchments. The fourteen parameters (Table 2) of the VMM are calibrated by the global optimization algorithm SCE-UA (Duan et al., 1993). The ranges of parameters are determined based on previous literature and prior knowledge (Bao and Zhao, 2014; Li et al., 2018).

In semiarid catchments, due to the rapid rise and fall of floods (usually less than 24 h), accurate simulations of the full hydrograph are not needed and cannot be realized. The Nash-Sutcliffe efficiency (NSE; (Nash and Sutcliffe, 1970) is widely used as an objective function of calibration in humid catchments; however, it may not be suitable for semiarid catchments because a good fit is not required between the simulated and observed streamflows. McIntyre and Al-Qurashi (2009) and Sharma and Murphy (1998) used the absolute relative error to evaluate model outputs (flow peak and flow volume) for semiarid areas, and the calibrated results indicated that the flow peak results are more accurate than suggested based on the NSE. Thus, the simulated hydrograph is reasonable for the majority of flood events. The equations are as follows:

$$E_p = \frac{1}{n}\sum_{i=1}^{n}\frac{|Q_p^i - Q_{pm}^i|}{Q_{pm}^i} \qquad (9)$$

$$E_v = \frac{1}{n}\sum_{i=1}^{n}\frac{|Q_v^i - Q_{vm}^i|}{Q_{vm}^i} \qquad (10)$$

where E_p and E_v are the average performances (in terms of absolute relative error) for peak flows and flow volumes in each catchment, respectively; n is the number of events; the index i denotes each event; Q_p and Q_{pm} are the simulated and measured values of peak flow per event, respectively; and Q_v and Q_{vm} are the simulated and measured values of flow volume per event, respectively.

Constraining the model output with peak flows and flow volumes can be expressed as follows:

$$E_{pv} = \frac{E_p + E_v}{2} \qquad (11)$$

where E_{pv} is the objective value. The closer E_{pv} is to 0, the better the model outputs. The number of iterations was set to 2000 in the calibration process.

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3.4 Model comparison

To achieve a better performance in rainstorm flood simulations, three hydrologic models, including two conceptual models, XAJ and SBM, and one distributed model, MIKE SHE, are used for comparison with the VMM model. XAJ was developed by (Zhao, 1992) and has a single saturation excess runoff generation mechanism. XAJ has been successfully applied in humid and subhumid catchments (Cheng et al., 2006; Lü et al., 2013;). SBM was developed by Zhao (1983) and has a single infiltration excess runoff generation mechanism. SBM is generally used in semiarid or arid catchments in China (Bao et al., 2017; Li and Zhang, 2008; Zhao et al., 2013). In addition, MIKE SHE originated from the Système Hydrologique Européen (SHE) program, and it is a deterministic, physically based distributed hydrologic model that can simulate surface water flow, unsaturated flow and saturated flow (Jayatilaka et al., 1998). MIKE SHE has been used to solve water resources and environment problems at different spatiotemporal scales (Li et al., 2018; Rujner et al.,2018; Samaras et al., 2016).

3.5 Multicriteria assessment framework for flood events

Due to strong spatially variability of rainfall, complex landscape characteristics, insufficient rain gauges, and dispersion, flood event simulation and forecasting in semiarid catchments are very difficult. Although some hydrologists improve flood simulations and forecasting by improving hydrologic models, the improvements are always limited or are suitable for only certain regions (Collier, 2007). The flood peak is the most significant feature in semiarid regions. Determining the extent to which the calculation of flood peaks can be accepted is crucial. Generally, the absolute relative error is used to measure the calculation of flood peak accuracy, for example, 20%, 30% or similar values are acceptable (Li et al., 2014; McIntyre and Al-Qurashi, 2009). To provide more information for flood defense management, the generalized likelihood uncertainty estimation (GLUE) and Bayesian method with the Markov chain Monte Carlo sampling are used to provide probabilistic forecasting, such as the 95% confidence interval (Christiaens and Feyen, 2002; Li et al., 2017), although these methods may not lead to clear decisions (Beven, 2007).

In this study, to obtain a useful method for decision maker, we propose a multicriteria assessment framework for flood forecasting in the catchments of middle Yellow River. This framework can be described as follows:

(C1) the absolute relative error of peak flow should be less than 20%.

(C2) modeled and observation of peak flows should be in the same flow zone: the observed peak flow Q_p of all flood events in a catchment are divided into three zones (low flow zone, medium flow zone, high flow zone), with 25th percentiles Q_{p25} and 75th percentiles Q_{p75} as the boundary points; if $Q_p \leq Q_{p25}$, then the peak flow Q_p belongs to the low flow zone; and if $Q_p \geq Q_{p75}$, then the peak flow Q_p belongs to the high flow zone; the rest flow peaks belongs to medium flow zone. Both the 25th percentile and 75th percentile are commonly used to distinguish zones.

(C3) The modeled peak flows should fall within one standard deviation (σ) of the mean (approximately 68.3% confidence interval) peak flow estimated by the HUP one component of the Bayesian forecasting system detailed in Krzysztofowicz (1999)

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and Biondi et al. (2010).

The key of the framework is C2, and C1 is used to avoid errors caused by flow zone boundaries. For example, when $Q_{p75} = 200$ m³/s, the modeled peak flow equals 198 m³/s, and the observed peak flow equals 201 m³/s. However, using only condition C2 may lead to inappropriate model results; adding C1 can help address the problem. C3 is used to test the confidence level of modeled peak flows. A modeled peak flow that can be accepted should satisfy condition C1 or condition C2 and then condition C3.

3.6 Parameter sensitivity analysis

To assess the effects of inputs on the model output, a sensitivity analysis (SA) was proposed (Saltelli et al., 1989). The SA can be classified into a GSA and local sensitivity analysis (LSA). Compared with the LSA, the GSA is able to analyze the effects of inputs within the entire input domain. The Fourier amplitude sensitivity test (Cukier et al., 1973), Sobol method (Sobol, 1993) and Morris screening method (Morris, 1991) are the most widely used GSA methods in the assessment of parameter sensitivity in hydrologic models. Pianosi and Wagener (2015) proposed the novel GSA method PAWN (derived from the authors' names), which is based on the cumulative density function. PAWN has advantages over the parameter ranking and time-consuming nature of other GSA methods (Khorashadi et al., 2017). In this study, we use the PAWN method to perform a GSA on the VMM model.

Considering $x_{i,j}$ $(i, j = 1, 2, \cdots$, where i and j represent the i-th input parameters and the j-th sampling, respectively) as sensitivity inputs, then the sensitivity of $x_{i,j}$ can be measured by the distance between $F_{(y_i|x_{i,j})}(y_i)$ (the cumulative probability distribution function of y_i when $x_{i,j}$ changes between the upper bound and lower bound) and $F_{y_i}(y_i)$ (the cumulative probability distribution function of y_i: when $x_i = \frac{1}{n}\sum_{j=1}^{n} x_{i,j}$, where n is the number of samplings per input parameter). The Kolmogorov–Smirnov statistic (Simard and Ecuyer, 2011) is used to measure the distance between $F_{(y_i|x_i)}(y_i)$ and $F_{y_i}(y_i)$:

$$KS(x_{i,j}) = \max_{1 \le j \le n} \left| F_{y_i}(y_i) - F_{(y_i|x_{i,j})}(y_i) \right| \tag{12}$$

As KS varies with $x_{i,j}$, the maximum of all possible KS is included in the PAWN index P_i:

$$P_i = \max_{1 \le j \le n} KS(x_{i,j}) \tag{13}$$

P_i ranges from 0 to 1. The closer P_i is to 1, the more sensitive x_i is. A P_i equal to 1 indicates that x_i has no effect on the model. For more information about PAWN, please refer to Pianosi and Wagener (2015). In this study, as Pianosi and Wagener (2018) suggested, the number of evaluations is set to 500.

3.7 Model validation

The modeling time step was hourly, and the modeling period was between 1983 and 2009. In the Qiushui River, 20 flood

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events were selected, with the first 15 events used for calibration and the remaining five events used for validation. Similarly, in the Qingjian River, 29 flood events were selected, with 24 events used for calibration and the remaining five events used for validation. In the Tuwei River, 23 flood events were selected, with 18 events used for calibration and the remaining five events used for validation. Finally, in the Kuye River, 28 flood events were selected, with 23 events used for calibration and the remaining five events used for validation.

4 Results and discussion

4.1 Comparison of model results

Boxplots of the absolute relative errors of the peak flows for each model in the four catchments are shown in Fig. 3. In terms of the median and average of the absolute relative errors for peak flows, except for the validation period in the Kuye River catchment shown in Fig. 3 (h), Figures 3 (a)–(g) reveal that the VMM has lowest values for both calibration and validation; in most cases, MIKE SHE performs better than the XAJ and SBM, i.e., Figures 3 (a), (b), (c), (d), (g), (h). Except for the good performance in the Tuwei River catchment, the SBM is as poor as the XAJ in other catchments. In terms of ranges of the absolute relative errors for peak flows, the VMM and MIKE SHE have relatively small ranges (Figs. 3(a), (c), (d), (g)); and the SBM and XAJ have large ranges in most cases (Figs. 3(a), (b), (c), (d), (g)).

Tables 3 and 4 show the average performance in terms of the absolute relative error for flow volume E_v and the lag time for the four models in each catchment, respectively. The VMM has the minimum average E_v and lag time, with values of 39.01% and 3.05 h, respectively (Tables 3 and 4). In contrast, the XAJ has the maximum average E_v and lag time, with values of 58.93% and 4.51 h, respectively. MIKE SHE and SBM have similar performances in terms of average E_v and lag time.

The analysis of Fig. 3, Table 3 and Table 4 shows that the VMM has the best performance for flood modeling in the four studied catchments of the middle Yellow River, and the XAJ has the worst performance. In addition, MIKE SHE is slightly superior to the SBM. Although MIKE SHE is a distributed hydrologic model with more complex structures and more explicit physical meaning than the conceptual model VMM, it does not necessarily achieve better results than conceptual models because distributed models lack sufficiently high-resolution data, and this finding is consistent with other studies (Beven, 2002, 2011; Michaud and Sorooshian, 1994; Seyfried and Wilcox, 1995). Both infiltration excess and saturation excess can be simulated via the VMM, which may be why it performs better than the other two conceptual models (XAJ and SBM), which have single runoff generation mechanisms (saturation excess and infiltration excess, respectively).

4.2 Sensitivity analysis of the VMM

The GSA method PAWN is applied to estimate the influence of parameter uncertainty on the model output results. Figure 4 (a) and Figure 4 (b) show the SA results of all study catchments for the objective function E_p (Eq. 9) or E_{pv} (Eq. 11), respectively. The higher the ranking is, the more sensitive the parameters. Parameters CS, IM and KE have the highest rankings

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whether the objective function of the VMM model is E_p or E_{pv}. The rankings of other parameters are influenced slightly by different objective functions, such as CG, except for WM. WM ranks sixth when E_{pv} is the objective function and 12th when E_p is the objective function. WM controls the tension water content in the soil, which determines the amount of rainfall stored in the soil and the generation of runoff. Therefore, it is reasonable to conclude that when the weight of the flow volume is added in E_p, which can be expressed as E_{pv}, the ranking of WM increases, in this case to sixth place.

4.3 Multicriteria assessment framework of the VMM

The multicriteria assessment framework we propose is applied to assess the ability of the VMM to model flood peaks in four catchments. The framework requires that an accepted flood event should meet one of the requirements of C1 and C2; in addition, C3 needs to be satisfied simultaneously. The observed peak flows and the modeled peak flows under the conditions C1, C2 or C3 are shown in Fig. 5. We find that the majority of peak flows for the observations and modeling fall between the 15.85th percentile and the 81.45th percentile (68.3% confidence interval) estimated by HUP, which means that the VMM modeling results satisfy C3 fairly well. Under the premise of satisfying C3, the number of modeling events satisfying C2 is slightly greater than that satisfying C1. Under the multicriteria assessment framework, 15 of the 20 (75.0%) modeled flood events in the Qiushui River catchment, 12 of the 29 (41.4%) of that in the Qingjian River catchment, 15 of the 23 (65.2%) of that in the Tuwei River catchment, and 16 of the 28 (57.1%) of that in the Kuye River catchment can be accepted. The average acceptance rate for the four catchments is 58%, which is greater than the acceptance rate of 41% under the single criterion C1, a common assessment for peak flows.

The multicriteria assessment framework can provide more reasonable and reliable flood early warning information for decision-makers. Taking the 13th flood event of the Kuye River catchment as an example, the observed and modeled peak flows are 1230 m³/s and 1510 m³/s, respectively. As shown in Fig. 5 (d), the absolute relative error for peak flow is greater than 20%, and the peak flow does not fall in the 68.3% confidence interval; however, these parameters are in the same zone, i.e., the medium flow zone. For the Kuye River catchment, it is reasonable to believe that the peak flows 1230 m³/s and 1510 m³/s correspond to the same level according to the known flood peak data, which is the role played by C2. Although the dividing flow zone method of C2 is coarse, it is convenient and beneficial for flood defense.

5 Conclusions

In this study, a multicriteria assessment framework of flood peaks is proposed with the vertically mixed runoff model (VMM) in four catchments in the middle Yellow River. The main conclusions are as follows:

(1) Compared with the distributed model MIKE SHE and the two conceptual models Xinanjiang (XAJ) and Shanbei (SBM), the VMM has better performance for modeling flood events in semiarid catchments of the middle Yellow River.

(2) In the four catchments, the parameters confluence coefficient of surface flow (CS), impermeable area (IM), and residence

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time of Muskingum (KE) are the most sensitive based on an analysis by the global sensitivity method PAWN; in addition, the sensitivity ranking of the parameter WM related with the soil moisture capacity is the most affected by the objective functions.

(3) The multicriteria assessment framework can provide more reliable flood early warning information than single criterion (such as absolute relative error of peak flows) when engineers need to make decisions in semiarid catchments.

The condition C2, which divides peak flows into three flow zones, will be affected by the number of known peak flows when data availability is limited. The framework is suitable for semiarid regions with poor modeling results and can provide guidance for decision making.

Code availability

We have shared the MATLAB code of the VMM model at https://doi.org/10.4211/hs.c5232287d5c04bfb8cac5ce4e391ea0f.

Acknowledgments

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Table 1. Characteristics of the four catchments

Catchment	Area (km^2)	Outlet station	Area* (km^2)	Mean annual precipitation (mm)	Mean evaporation (mm)	Aridity index
Qiushui River	1989	Linjiaping	1873	499	1150	2.31
Qingjian River	4080	Yanchuan	3468	451	1080	2.4
Tuwei River	3294	Gaojiachuan	2095	377	1050	2.78
Kuye River	8706	Wenjiachuan	8645	410	1010	2.46

* The area of the catchment controlled by the outlet station in the table.

Table 2. Calibrated parameters of the VMM

Symbol	Definition	Range*
KC	Ratio of potential evapotranspiration to pan evaporation	[0.5, 1.5]
WM	Mean areal maximum possible soil moisture, mm	[50, 200]
FC	Stable infiltration capacity, mm/h	[5, 100]
K	Infiltration index related to soil permeability, /h	[0.05, 1]
BF	Index of the watershed infiltration capacity curve	[0, 0.5]
B	Index of the watershed water storage capacity curve	[1, 2]
KI	Outflow coefficient of interflow, d	[0.1, 0.5]
KG	Outflow coefficient of groundwater, d	[0.5, 2]
CS	Confluence coefficient of surface flow	[0.05, 0.9]
CI	Recession coefficient of interflow, d	[0.5, 0.95]
CG	Recession coefficient of groundflow, d	[0.90, 0.99]
KE	Residence time of Muskingum, h	[0.5, 5]
XE	Muskingum coefficient	[0.01, 0.49]
IM	Impermeable area	[0, 1]

*In [a, b], a and b represent the lower and upper bounds of the parameters, respectively.

Table 3. Performance (in terms of absolute relative error) for peak flow E_v in each catchment in the four models

Unit: %

	Qiushui River	Qingjian River	Tuwei River	Kuye River	Average[*]
VMM	26.52	58.50	40.20	30.80	39.01
MIKE SHE	40.50	60.70	45.30	38.20	46.18
XAJ	56.60	66.61	60.20	52.30	58.93
SBM	38.14	55.82	35.50	45.2	43.15

[*]The average E_v of the four catchments for each model

Table 4 Lag time of the peak flow in the four catchments in the four models   Unit: h

	Qiushui River	Qingjian River	Tuwei River	Kuye River	Average[*]
VMM	2.20	3.02	3.46	3.50	3.05
MIKE SHE	2.50	3.50	4.20	3.90	3.53
XAJ	4.10	3.81	5.62	4.50	4.51
SBM	4.00	2.95	3.46	4.20	3.65

[*]The average lag time in the four catchments for each model

Yellow River Basin

107° E   108° E   109°

39° N

®

38° N

Legend
Rain gauge station
Hydrological station
Drainage network
Qingjian River catchmer
Qiushui River catchmen
Tuwei River catchment
Kuye River catchment

37° N

0   30   60   120   18

107° E   108° E   109° E
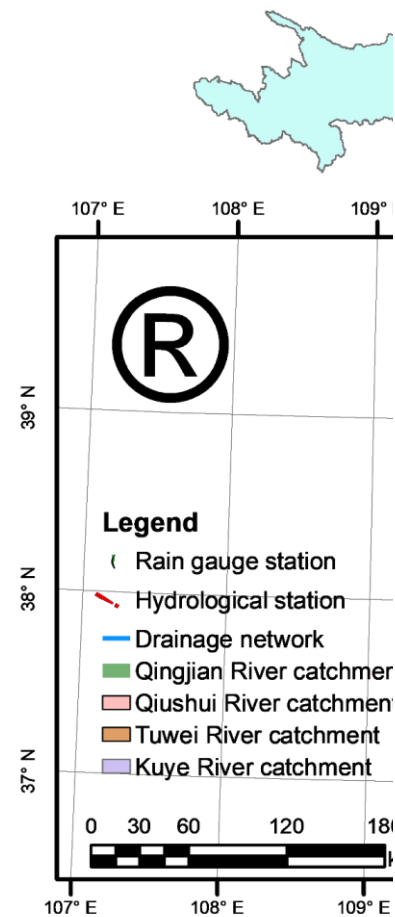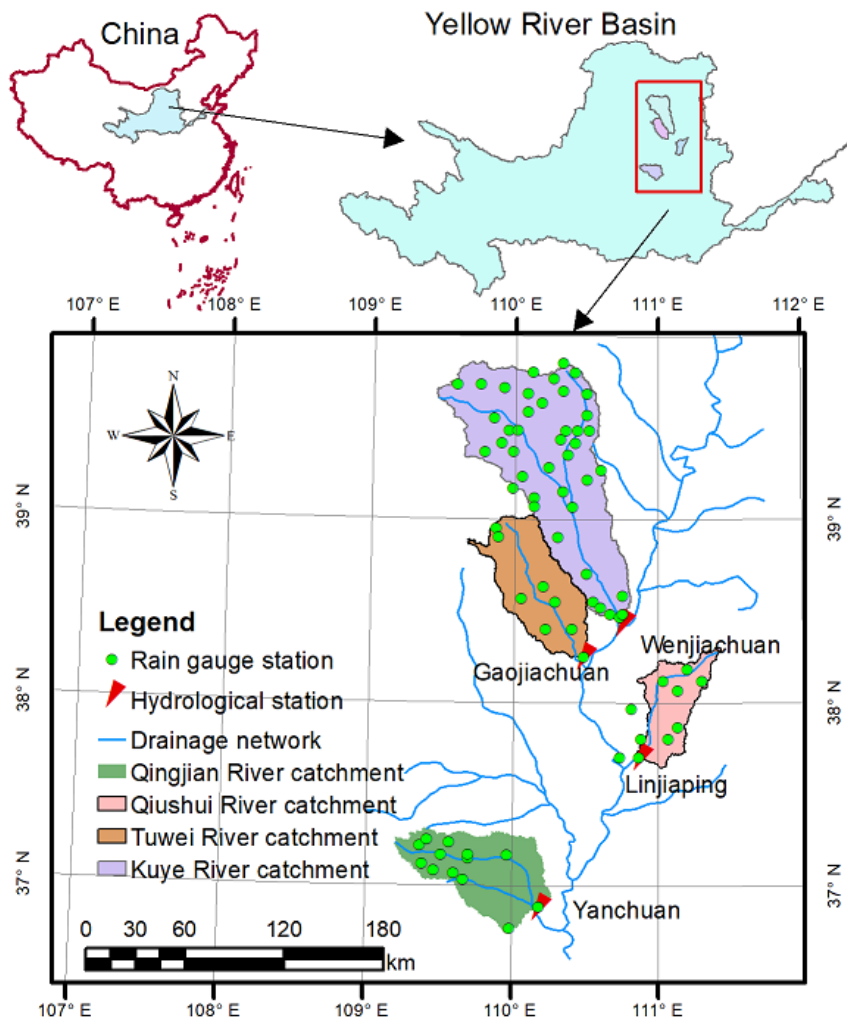
Figure 1: Location of the Qingjian River catchment, Qiushui River catchment, Tuwei River catchment and Kuye River catchment.
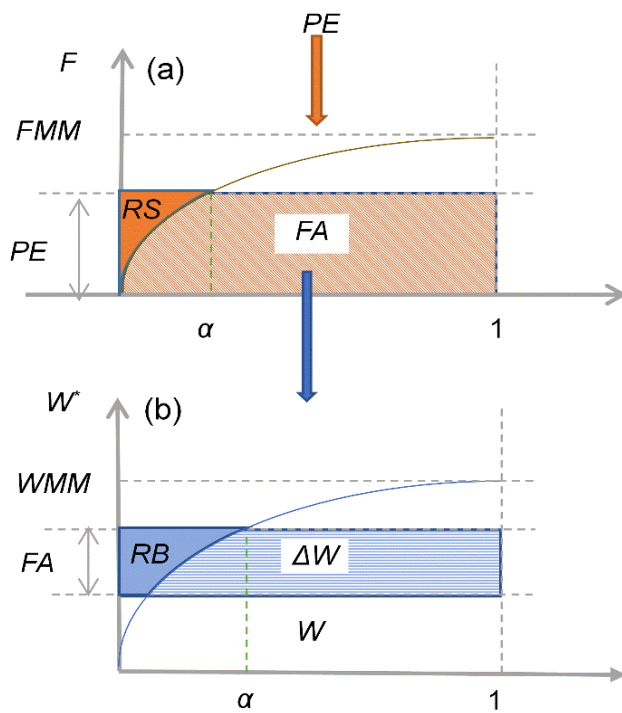
Figure 2: Runoff generation module in the VMM. (a) Infiltration capacity curve; and (b) tension water content storage capacity curve. α **is the fracture area that is saturated, and** F **represents the point infiltration capacity.**
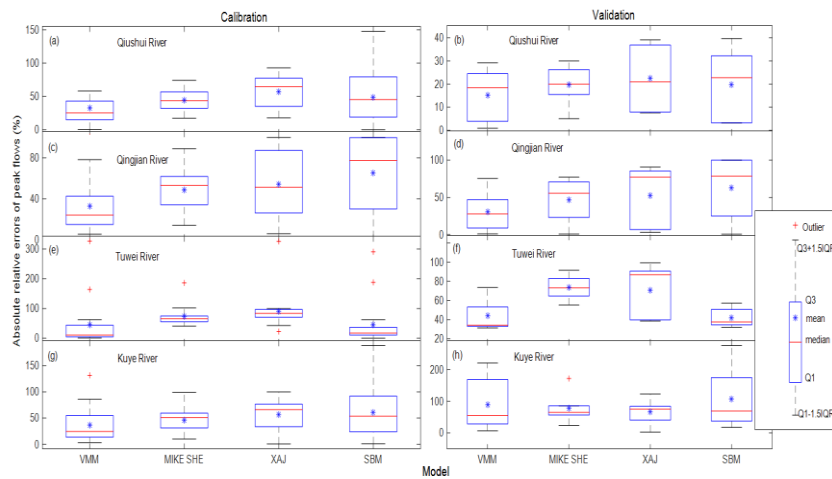
Figure 3: Boxplot of absolute relative errors of peak flows in the four catchments; Q1 and Q3 mean the first quantile and third quantile, respectively; interquartile range (IQR) = Q3 − Q1; and an outlier is defined as an extreme value that exceeds the IQR.

Figure 4: Sensitivity rankings of the VMM parameters based on the global sensitivity analysis method PAWN for different objective functions: (a) E_{pv} as the objective function, and (b) E_p as the objective function. The value P is used to assess the sensitivity degree of the parameter with PAWN method, and a larger value corresponds to greater sensitivity. The numbers on the ordinate represent the sensitivity rankings. $E_{pv}E_p$
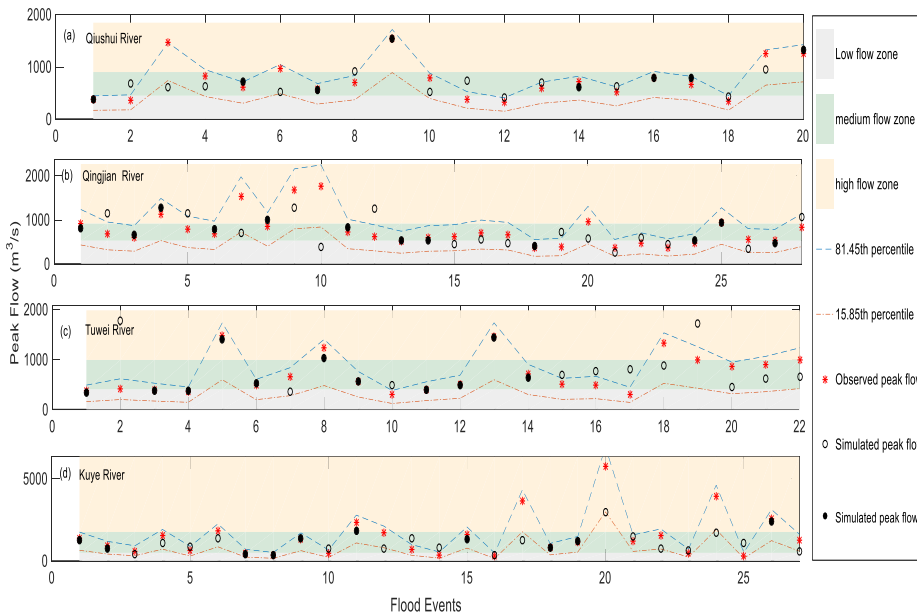
Figure 5: Observed peak flows (red asterisk) and simulated peak flows (solid ball and circle) with the VMM for each catchment under the conditions C1, C2 and C3. Flood peaks conforming to the condition C1 is represented by a solid ball; the three flow zones (low, medium and high flow zones) divided by the condition C2 are shown in gray, green and off-white, respectively; 68.3% confidence interval of peak flows estimated by the condition C3 is between the blue dashed line (81.45th percentile) and the red dashed-dotted line (15.85th percentile).

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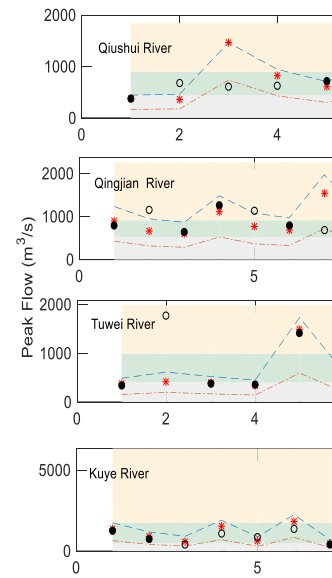
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the condition C1.¶

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