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# RESEARCH TRENDS IN HYDROLOGICAL MODELLING

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#### **Abstract**

This paper reviews the hydrological modelling research trends as published in the recent years. Three-round literature review technique was used to study journal papers published that are related to the hydrological modelling. The published papers were searched by using Web of Sciences engine. The first and second round were to examine the published papers as a general perspective in a wide range of hydrological modelling through title and keywords whereas the third round was to establish 139 papers as target publications through abstract and main texts. 139 target papers were analyzed in terms of (1) journals that produced two or more target papers, (2) research origin, (3) authors, (4) research center and (5) most cited papers. The score matric was used to rank these items. The results of analysis produced (1) 6 journals target papers, (2) United states got the highest score with 27.71 score for research origin, (3) Keith Beven got the highest score 8.03 for an active researcher, (4) Lancaster University got the highest score 9.93 for research center and (5) Keith Beven and Andrew Binley had the most cited papers.

Keywords: Hydrological modelling, flood modelling, rainfall-runoff modelling, ISI journals, research trends

#### **Abstrak**

Kajian ini untuk mengkaji trend penyelidikan pemodelan hidrologi seperti yang diterbitkan pada tahun-tahun kebelakangan ini. Teknik peninjauan kesusteraan tiga bulat digunakan untuk mengkaji kertas jurnal yang diterbitkan yang berkaitan dengan pemodelan hidrologi. Kertas yang diterbitkan telah dicari dengan menggunakan enjin Web Sains. Pusingan pertama dan kedua adalah untuk mengkaji kertas-kertas yang diterbitkan sebagai perspektif umum dalam pemodelan hidrologi yang luas melalui tajuk dan kata kunci manakala pusingan ketiga adalah untuk menetapkan 139 kertas sebagai penerbitan sasaran melalui teks-teks abstrak dan utama. 139 kertas kerja dianalisis dari segi (1) jurnal yang menghasilkan dua atau lebih kertas sasaran, (2) sumber penyelidikan, (3) pengarang, (4) pusat penyelidikan dan (5) kertas paling banyak dikutip. Skor matrik digunakan untuk menilai item-item ini. Hasil analisis yang dihasilkan (1) 6 jurnal kertas sasaran, (2) Negara Amerika mendapat skor tertinggi dengan skor 27.71 untuk penyelidikan asal, (3) Keith Beven mendapat skor tertinggi 8.03 untuk penyelidik aktif, (4) Lancaster University mendapat skor tertinggi 9.93 untuk pusat penyelidikan dan (5) Keith Beven dan Andrew Binley mempunyai kertas paling banyak.

Kata kunci: Pemodelan hidrologi, pemodelan banjir, pemodelan hujan-air larian, jurnal ISI, trend penyelidikan

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#### 1.0 INTRODUCTION

The water related challenges are huge and will increase in the future. In response to these challenges, hydrological modelling has developed to analyse, understand and explore solutions for sustainable water management, to the decision makers and operational water managers. In order to test new hypotheses and to obtain a better understanding regarding hydrological processes, the most needed tool is hydrological modeling [1]. To understand hydrologic processes, a large amount of detailed quantitative measurements is required at different spatial and temporal scales. The strength of hydrological models is that they can provide output at high temporal and spatial resolutions, and for hydrological processes that are difficult to observe on the large scale that they are generally applied on. Hydrological models therefore enable us to gain insight into hydrologic processes using a limited number of measurements [2].

The hydrological modelling can generally be classified into empirical, conceptual and physically based models [3]. The empirical model is the data based or black box model that involves the mathematical equations and derives value from available time series. The conceptual model is parametric or grey box model based on modelling of reservoirs and include semi empirical equations with a physical basis. The physically based model is mechanistic or white box model based on spatial distribution and evaluation of parameters describing physical characteristics [3].

Some researchers define the empirical model as soft computing techniques [4] with given examples of the model are Artificial Neural Networks (ANN) (e.g. [5]), Genetic Algorithms (GA) (e.g. [6]), Fuzzy Logic (FL) (e.g. [7]) and unit hydrograph. HBV model (e.g. [8]) and TOPMODEL (e.g. [9]) are example of conceptual model. Physical based models have recently increasing in the market of software with examples such as MIKESHE (e.g. [10]), SWAT (e.g. [11]), InfoWorks and TREX (e.g. [12]). Blomqvist et al., (2013) outline the steps in model application which include problem identification, data availability, choice of model, determination of parameter value, validation and problem solving [13].

The successful application of a hydrological modelling depends on how well the model is calibrated. The difficulties in the application of such methods are interdependence between model parameters, discontinuities or points on the response surface, local optima on the response surface and the scaling of parameters [14]. The limitation in this modelling is in terms of understanding and predicting hydrologic change through the spatial characteristics. The data limitations may be the key cause of this [15].

The publications especially related to academics will be the sources for the researcher in their research works. The publication of this modeling article in

academic journals had started from the year 1986 [16] to the recent distributed physically-meaningful models [17-19]. [20] had reviewed the scale issues in hydrological modeling in while the recent review is regarding the parameters involved in the certain model [3].

Nowadays, hydrological modeling works have taken over the most important tasks in problem solving in hydrology [21] which subsequently leads to the increase in the publication of this topic year by year. The contents in the research and the software used have also been upgrading in line with the technology development. In this study, the authors had reviewed most of the academic journal publications to analyze the research trends and identify the patterns of hydrological modeling publications. The retrieval from academic journals is regarded as the most effective approach for the research community, especially for new researchers in particular, to gain in-depth insight into the research trends. In this regard, a systematic review of hydrological modelling success factors had been undertaken with the following derived objectives: 1) To ascertain the annual publication trends of hydrological modelling from 1980 to 2010; 2) To identify authors' origin/country and the active contributors in exploring the hydrological modelling from 1980 to 2010; and 3) To identify countries with most published papers on the hydrological modelling.

#### 2.0 METHODOLOGY

Searching on an academic journal particularly on the specific topic is necessary in order to have a comprehensive review and analysis on previous research studies [22]. Therefore, this study had adopted a combination of comprehensive methods used by [23], [24] and [25]. The three round literature reviews were conducted to document the research study of hydrology modelling. A flowchart of the three round literature reviews was illustrated in Figure 1. Therefore, this research method was developed to ensure no papers with high relevancy are left out.

In Stage 1, the search engine "Scopus" was used as the main source to obtain paper. This search engine was chosen because it covers most of the research journals [24]. To ensure that no paper will be missed, additional search engine, i.e. Web of Science and Google Scholar were also used to extract the papers that relate to the "titles, abstract/keywords". These additional search engines were used as it is believed that they have better search engine in term of coverage and accuracy, as compared to other search engines. These search engines are also popular among hydrological modeler. Since the main subject matter for this study is modelling, two different spellings had been considered, i.e. modelling and modeling to cover papers written both in US English and British English. The subject areas to be searched were hydrology modelling/modeling, hydrological modelling/modeling, rainfall-runoff modelling/modeling, runoff modelling/modeling, discharges modelling/modeling, flood modelling/modeling, extreme discharge modelling/modeling. These terms are classified into hydrological modelling. The complete search code is listed as follows:

TITLE-ABS-KEY ("hydrology modelling/modeling" OR "hydrological modelling/modeling" OR "rainfallrunoff modelling/modeling" OR "runoff "discharges modelling/modeling" OR modelling/modeling" "flood OR modelling/modeling" OR "extreme discharge modelling/modeling")

The search is strictly limited to hydrological modelling. However, there are high possibility that some unwanted papers appeared. To narrow down the search finding, all search results were only analyzed for the paper published in top-ranked journals. This process was done in stage 2, which main purpose is to testify the level of attention in hydrological modelling.

In stage 3, the scope was narrowed down by visual examination of abstracts and main texts. Any unrelated papers were excluded and papers addressing hydrology modelling issues extracted as selected papers to obtain the information which are contents, research origin, research centre, active researcher, most cited papers and research pattern. The calculation of score uses a quantitative method by [26] to differentiate the contribution of each author in a coauthored paper. The score calculation was chosen because of its simplicity to represent the actual contribution every author. Typically, the first author contributes more than the second author and the second more than the third and so on. Each publication was given one point, no matter how many authors there were. If more than one author participated in producing the paper, the one point was divided into corresponding parts for each author [25]. The score calculation formula is shown as follows.

$$\mathsf{Score} = \frac{1.5^{n-1}}{\sum_{i=1}^{n} 1.5^{n-i}}$$

Where n means the number of authors that contributed to the paper and i is the order of each specific writer. A detailed score distribution for authors is presented in Table 1, which was produced using formula above.

Table 1 Score matrix for more than 1 author

No. of author	Order	of author			
	1	2	3	4	5
1	1				
2	0.60	0.40			
3	0.47	0.32	0.21		
4	0.42	0.28	0.18	0.12	
5	0.38	0.26	0.17	0.11	0.08

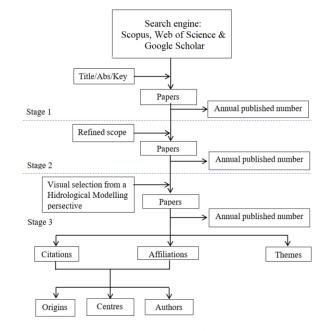


Figure 1 The research flowchart

#### 3.0 RESULTS AND DISCUSSION

### 3.1 Holistic View of Hydrology Modelling Papers Published

The search result derived from stage 1 until stage 3 produced 8 journals with 5 different publishers. These journals are name based on their rank, as shown in Table 2, (based on number of paper published) Journal of Hydrology (JH), Journal of Advanced in Water Resources (AWR), Hydrological Sciences (HS), Hydrology and Earth System Sciences (HESS), Hydrological Processes (HP), Water Resources Research (HRR), Water Research (WR) and Water Resources Management (WRM). There are 139 related papers in total which had been published by these journals. JH was found to publish the highest number of papers, followed by AWR, which are 28 papers. Two journals, i.e. WR and WRM, were found published less than 10 numbers of papers. Among these 8 journals, Elsevier Publisher was found to publish highest number of papers, i.e. 83 papers. Three (3) journals published under Elsevier are JH, AWR and WR. Wiley Publisher published in total of 24 numbers of papers in their two (2) different journals, i.e. HP and WRR, with 12 number of papers each journal. The remaining of the journals is published by Taylor & Francis (HSJ), EGU (HESS) and Springer (WRM).

# 3.2 Active Authors, Research Centers and Origins, and Regional Concerns

The origin of the author, author, research/institution center and most paper cited were ranked based on the score matric as shown in Table 1. The score will be assigned for each author and finally will accumulate based on the category to be evaluated. For instance, Table 3 shows the research score of each author based on origin country. The United States has the highest score with 27.71 while Tanzania has the lowest score with 0.40 in post hydrology modelling publications. These values were assigned by accumulating origin all authors contributed for each country. For instance, one paper with title of "Effects of spatial variability and scale with implications to hydrologic modeling" was chosen [27]. This paper was written by four (4) authors, i.e. Wood, Sivapalan, Beven and Band (1988) and each author will have a score of 0.42, 0.28, 0.18 and 0.12, respectively (refer to Table 1). A score of 0.82 (from Wood - 0.42, Sorooshian - 0.28 and Band - 0.12) is awarded to United States and the score of 0.18, i.e. contributed by Beven, is awarded to United Kingdom. This analysis was also applied to calculate the score of each author and research centres. From Table 3, three countries, i.e. the United States, the United Kingdom and Australia, had published the highest number of hydrological modelling papers with scores of 27.71, 15.70 and 14.30, respectively. These countries can produce large number of publications because of the international collaboration between them, as shown by Wood et al. (1988) for their paper entitled "Effects of spatial variability and scale with implications to hydrologic modeling" [27]. One of the reasons why US can have highest score is because this country has 49 different research centers with 103 researchers and had produced 46 papers. The total percentage number of papers contributed by these countries is 44% (92 in 208). The high contribution of the three countries to hydrological modelling can be due to:1) international collaboration in producing papers, 2) the hydrological modelling study is dominant by these three countries and 3) high number of research centers and researchers.

**Table 2** Journals that produced two or more target papers

Journal title (Publisher; Impact Factor (IF) – as for 2016)	Number of journal
Journal of hydrology (Elsevier; IF: 3.483)	48
Advances in water resources (Elsevier; IF: 3.221)	28
Hydrological sciences journal (Taylor & Francis; IF: 2.222)	15
Hydrology and earth system sciences (EGU; IF: 4.437)	15
Hydrological processes (Wiley; IF: 3.014)	12
Water resources research (Wiley; IF: 4.397)	12
Water research (Elsevier; IF: 6.942)	7
Water resources management (Springer; IF: 2.848)	2

**Table 3** Research origin of published Hydrological Modelling papers

Origin	Number of research centres	Number of researches	Number of papers	Score
United States (US)	49	103	46	27.71
United Kingdom (UK)	14	34	24	15.70
Australia	28	47	22	14.30
China	26	36	13	9.26
Canada	15	35	12	8.65
France	14	27	8	7.93
Netherlands	10	20	10	6.85
Italy	7	16	7	3.92
india	6	7	4	3.60
Denmark	8	15	4	3.49
Norway	9	11	5	3.31
Germany	9	19	6	2.77
Spain	11	13	5	2.71
Iran	3	5	3	2.60
South Africa	4	4	4	2.40
Turkey	3	6	2	2.00
New Zealand	3	5	3	1.72
Sweden	3	5	4	1.64
Equador	2	3	2	1.60
Ireland	2	5	2	1.50
South Korean	5	8	2	1.42
Switzerland	5	8	3	1.10
Poland	2	2	2	0.68
Thailand	2	2	2	0.68
Tanzania	2	2	2	0.40

Table 4 shows the researchers involved in two or more target papers. The top ten (10) highest score by author are from the United State, the United Kingdom and Australia. Total percentage contribution by these authors (excluding from Norway and South Africa) is 48.8% (61 in 125). The statistic in Table 4 support findings in Table 3, as discussed before. Beven, Singh and Sivapalan had produced 11 papers respectively but different in score. Beven recorded the highest score with 8.03 point is a researcher from Lancaster University, United Kingdom. He has the highest score because he authored 11 papers. It should be noted that most of the time, he wrote these papers as a single author or less than 3 authors. Singh recorded the second highest score with 5.28 point is from Lousiana University from United States while Sivapalan recorded the third highest score with 4.27 point is from Lancaster University, United Kingdom.

Table 4 Researchers involved in two or more papers

Researchers	Affiliati	on	Country	No. of papers	Score
K. Beven	Lancaster University		UK	11	8.03
V. P. Singh	Louisiana University	State	USA	11	5.28
M. Sivapalan	Lancaster University		UK	11	4.27
S. Sorooshian	University Arizona	of	USA	10	2.05

Researchers	Affiliation	Country	No. of papers	Score
H. V. Gupta	University of Arizona	USA	7	1.58
V. K. Gupta	University of Arizona	USA	5	2.39
Chong- YuXu	University of Oslo	Norway	4	1.64
G. Blöschl	The Australian National University	Australia	3	1.35
Eric F.wood	Princeton University	USA	3	1.16
Tumbo, M	Rhodes university	South Africa	2	1.00
Newsha K. Ajami	University of California	USA	2	0.89
Bárdossy, A	University of Stuttgart	Germany	2	0.87
Hamid Moradkhani	University of California	USA	2	0.84
Jasper A. Vrugt	University of Amsterdam	Netherlan ds	2	0.80
Zhang, Y.,	Csiro land and water flagship	Australia	2	0.80
Zhang, H.	University of regina	Canada	2	0.77
Zhang, X.,	Earth and environmental sciences division	USA	2	0.70
Montanari, A.,	University of bologna	Italy	2	0.68
Kuo-Lin Hsu	University of California	USA	2	0.65
Engeland, K	University of Oslo	Norway	2	0.59
Brissette, F.	University of quebec montreal	Canada	2	0.57
Huang, G. H.	University of regina	Canada	2	0.53
Andréassian , V.	Irstea,hydrosyste ms and bioprocesses research unit	France	2	0.53
Perrin, C.	Irstea,hydrosyste ms and bioprocesses research unit	France	2	0.53
Vaze, J.	Csiro land and water flagship	Australia	2	0.53
Maier, H. R.	University of	Australia	2	0.44
Madsen, H.,	adelaide DHI, Horsholm	Denmark	2	0.38
Chiew, F. H.	Cairo water for a healthy country national research flagship	Australia	2	0.36
Xu, CY.	University of Oslo	Norway	2	0.35
Wang, D.,	national research council regina	Canada	2	0.34
Mahé, G.,	Hydrsciences montpellier	France	2	0.33
Willem Bouten	University of Amsterdam	Netherlan ds	2	0.29
Zappa, M.	Swiss federal research institute	Switzerlan d	2	0.27
Larry band	City University of New York	USA	2	0.24
Li, M.	Cairo land and water flagship	Australia	2	0.20
Dezetter, A.	hydrsciences montpellier	France	2	0.19
Refsgaard, J. C.	University of copenhagen	Denmark	2	0.19
Servat, E.	Hydrsciences montpellier	France	2	0.18

Researchers	Affiliation	Country	No. of papers	Score
Lee, HJ.	National institute of environmental research	Korean	2	0.17

Table 5 illustrated the research center with the location of the center in country, number of researchers, number of papers and number of scores. In overall, the highest contribution of researchers is from the Lancaster University, United Kingdom which has a score point of 9.93 by producing 15 papers from 5 researchers. The University of Arizona, USA and the research center in post hydrology modelling, University of Louisiana, US were the second and third ranked centers/university, as shown in Table 5. These centers/university have scored of 6.64 and 4.40 point, respectively.

As a result, it is important to analyze the citation of target papers to further appraise contributions of a specific author on publications. The citation for each journal had been obtained from Google Scholar. This search engine was used due to its wide coverage of citation report for all fields and analysis using this engine is consistent and reliable in nature [24] and continuously updated. They also added that Scopus search engine, which had been used for the analyses shown in Tables 2, 3 and 4, have limitations in terms of its coverage in the citation report of the most contributive papers. Most frequently cited paper was listed in Table 6. The top ten (10) most cited papers were published by Elsevier (4), Wiley (4), Taylor & Francis (1) and ASCE (1). The paper entitled "The future of distributed models: model calibration and uncertainty prediction" written by Beven and Binley in 1992 has been cited for 3,731 times which ranked it to the first place [28].

**Table 5** Research centre with the highest scores

Research centre	Country	Number of researches	Number of papers	Score
Lancaster University	UK	5	12	9.93
University of Arizona	USA	12	9	6.64
Louisiana State University	USA	7	7	4.40
University of Western Australia,	Australia	4	7	4.17
National hydrology research institute	Canada	3	2	2.00
University of Adelaide	Australia	7	2	2.00
Rhodes University	South Africa	3	2	2.00
Princeton University	USA	4	6	1.83
UNESCO-	Netherlan	6	3	1.82

Research centre	Country	Number of researches	Number of papers	Score
IHE Institute for water education	ds			
Norwegian water				
resources and energy directorate	Norway	4	3	1.64
University of bologna	Italy	6	2	1.60
University of Tehran	Iran	4	2	1.60
Nanjing university	China	8	2	1.58
University of regina	Canada	8	2	1.55
Texas A & M University,	USA	2	4	1.48
DHI, Horsholm	Denmark	6	2	1.43
University of California	USA	4	3	1.29
Uppsala University	Sweden	1	2	1.20
University of Stuttgart	Germany	3	2	1.19
Delft university of technology	Netherlan ds	3	2	1.19
University of florida	USA	3	2	1.18
Geological survey of denmark	Denmark	4	2	1.10
University of Amsterdam	Netherlan ds	2	4	1.10
The Australian National University	Australia	1	2	1.07
Colorado State Univ	USA	4	4	1.07
University of oslo	Norway	4	2	1.03
University of California	USA	2	2	0.91
Imperial College of Science, Technology and Medicine	UK	3	3	0.64
Chinese Academy of Sciences	China	2	2	0.60
Sun Yat-sen University	China	2	2	0.47
University of Oslo	Norway	1	2	0.44
CRC for Catchment Hydrology, CSIRO Land	Australia	2	2	0.30

Research centre	Country	Number of researches	Number of papers	Score
and Water, Canberra, Australia				
City University of New York	USA	1	2	0.24

It is interesting to note that, the research origin, active researchers, research centre and the most cited papers are from the United States and United Kingdom. Keith Beven was found to be the most active researcher in hydrological modelling field until to date. In general, countries such as United States and United Kingdom have met the expectation as developed countries with top ranked research universities which had spurred the growth in hydrological modelling studies. In addition each country itself had experienced many environmental and hydrological related disasters including flood and hurricanes which require real effective application in hydrological modelling.

#### 4.0 CONCLUSION

Research in hydrological modelling has a wide range of applications in environmental management especially in water resources planning, management, and development. However, there are some limitations and challenges due to resource and limited range of available measurement techniques. This study conducted a three round literature review of published journal papers to investigate the most popular and cited work in hydrology modelling field. Using the web of sciences search engine, the author adopted a combination of keyword, title, abstract and main text to identify 139 target papers to study past trends. As one of the most developed countries in the world, the United States leads in the research origin of publications in hydrology modelling. Keith Beven from Lancaster University, United Kingdom is ranked as the most active researcher in hydrological modelling publications. The Lancaster University has recorded the highest score in research center. Paper by Keith Beven and Andrew Binley was the most cited with 3731 citations. In conclusion, the post hydrological modelling research trends have provided a holistic review for other researchers to find a platform in a new field. The wide range opportunities available in post research hydrological modelling in terms of patterns, themes and active researchers allow the becoming researcher to discover new issues and develop new techniques and approach in hydrological modelling field. The information in this paper can also be used to identify the new network between the countries that have a similar research interest.

**Table 6** Most cited papers

Author/published year	Paper title	No. of times cited
Beven, K., & Binley, A. (1992). [28]	The future of distributed models: model calibration and uncertainty prediction (Wiley).	3731
Beven, K. (1989). [29]	Changing ideas in hydrology—the case of physically-based models (Elsevier).	1792
Beven, K., & Freer, J. (2001). [30]	Equifinality, data assimilation, and uncertainty estimation in mechanistic modelling of complex environmental systems using the GLUE methodology (Elsevier).	1641
Blöschl, G., & Sivapalan, M. (1995). [20]	Scale issues in hydrological modelling: a review (Wiley)	1619
Hsu, K. I., Gupta, H. V., & Sorooshian, S. (1995). [31]	Artificial neural network modeling of the rainfall-runoff process (Wiley).	1378
Beven, K. (1993). [32]	Prophecy, reality and uncertainty in distributed hydrological modelling (Elsevier).	1170
Vrugt, J. A., Gupta, H. V., Bouten, W., & Sorooshian, S. (2003). [33]	A Shuffled Complex Evolution Metropolis algorithm for optimization and uncertainty assessment of hydrologic model parameters (Wiley).	1013
Klemeš, V. (1986). [16]	Operational testing of hydrological simulation models (Taylor & Francis).	793
Singh, V. P., & Woolhiser, D. A. (2002). [34]	Mathematical modeling of watershed hydrology (ASCE).	784
Wood, E. F., Sivapalan, M., Beven, K., & Band, L. (1988). [27]	Effects of spatial variability and scale with implications to hydrologic modeling (Elsevier).	758
Beven, K. (2001). [35]	How far can we go in distributed hydrological modelling?	682
Moradkhani, H., Sorooshian, S., Gupta, H. V., & Houser, P. R. (2005). [36]	Dual state-parameter estimation of hydrological models using ensemble Kalman filter.	647
Vrugt, J. A., Gupta, H. V., Bastidas, L. A., Bouten, W., & Sorooshian, S. (2003). [37]	Effective and efficient algorithm for multiobjective optimization of hydrologic models.	561
Beven, K. J. (1990). [38]	A discussion of distributed hydrological modelling.	546
Moradkhani, H., Hsu, K. L., Gupta, H., & Sorooshian, S. (2005).[39]	Uncertainty assessment of hydrologic model states and parameters: Sequential data assimilation using the particle filter.	464
Wagener, T., Sivapalan, M., Troch, P., & Woods, R. (2007). [40]	Catchment classification and hydrologic similarity.	448
Beven, K. J. (2000). [41]	Uniqueness of place and process representations in hydrological modelling.	424
Beven, K. (2002). [42]	Towards an alternative blueprint for a physically based digitally simulated hydrologic response modelling system.	424
Wagener, T., Boyle, D. P., Lees, M. J., Wheater, H. S., Gupta, H. V., & Sorooshian, S. (2001). [43]	A framework for development and application of hydrological models.	421
Ajami, N. K., Duan, Q., & Sorooshian, S. (2007). [44]	An integrated hydrologic Bayesian multimodel combination framework: Confronting input, parameter, and model structural uncertainty in hydrologic prediction.	393
Mishra, A. K., & Singh, V. P. (2011). [45]	Drought modeling-A review.	369
Butts, M. B., Payne, J. T., Kristensen, M., & Madsen, H. (2004). [46]	An evaluation of the impact of model structure on hydrological modelling uncertainty for streamflow simulation.	328
Beven, K. (1995). [47]	Linking parameters across scales: subgrid parameterizations and scale dependent hydrological models.	328
Sivapalan, M., Blöschl, G., Zhang, L., & Vertessy, R. (2003). [48]	Downward approach to hydrological prediction.	326
Jiang, T., Chen, Y. D., Xu, Cy., Chen, X., Chen, X., & Singh, V. P. (2007). [49]	Comparison of hydrological impacts of climate change simulated by six hydrological models in the Dongjiang Basin, South China.	303
Sorooshian, S., & Gupta, V. K. (1983). [50]	Automatic calibration of conceptual rainfall-runoff models: The question of parameter observability and uniqueness.	290
Singh, V. (1997). [51]	The use of entropy in hydrology and water resources.	282
Ajami, N. K., Gupta, H., Wagener, T., & Sorooshian, S. (2004). [52]	Calibration of a semi-distributed hydrologic model for streamflow estimation along a river system.	251
Sivapalan, M. (2005). [53]	Pattern, process and function: elements of a unified theory of hydrology at the catchment scale.	250
Xu, CY., & Singh, V. P. (2004). [54]	Review on regional water resources assessment models under stationary and changing climate.	239
Singh, V. (1997). [55]	Effect of spatial and temporal variability in rainfall and	234

Author/published year	Paper title	No. of times cited
	watershed characteristics on stream flow hydrograph.	
Xu, CY., & Singh, V. P. (1998). [56]	A review on monthly water balance models for water resources investigations.	234
Strupczewski, W., Singh, V., & Feluch, W. (2001). [57]	Non-stationary approach to at-site flood frequency modelling I. Maximum likelihood estimation.	211
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