

Ecohydrology Towards Integrative Ecosystem Modeling

Ekohidrologi Menuju Pemodelan Ekosistem yang Terintegrasi

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Abstract. While strong coupling of water and ecosystem is well known for centuries, the concept of ecohydrology has just been coined about three decades ago. Ecohydrology expands the hydrology research point of view to include ecological parameter to its modeling, to solve ecosystem problems. This review was done to identify the trend of water related research during the past decade, with the intention to find gaps between hydrology and ecology research toward integrative ecosystem modeling. The data from highly cited articles in three high impact factor publications in water resources category show that only about 10% of the total research articles included ecosystem as the quantitative parameter. Three scientific gaps resulting this low ecosystem discussion in hydrology research were then identified, including issue gap, in which water are treated as an individual empirical or state variable; model gap, where only water parameters are considered in the water related model; and data gap, related to data availability to assess problem in ecosystem scale. Therefore, three recommendations were proposed, including to view water as a natural capital to include ecosystem parameters in the model, to use integrated water-ecosystem model and to develop data upscaling-downscaling techniques coupled with the uncertainty analysis.

Keywords: Hydrology / Ecology / Ecohydrology / Ecosystem / Environmental Modeling

Abstrak. Keterkaitan antara air dan ekosistem sudah dikenal sejak lama, akan tetapi konsep ekohidrologi baru saja diperkenalkan sejak tiga dekade yang lalu. Konsep ini memperluas tema penelitian di bidang hidrologi dengan mengintegrasikan parameter ekologi ke dalam proses pemodelannya. Artikel ini ditulis untuk mengidentifikasi tren penelitian di bidang hidrologi selama satu dekade terakhir (2004-2015), dengan tujuan utama untuk mencari kesenjangan antara penelitian hidrologi dan ekologi ke arah pemodelan ekosistem yang terintegrasi. Data dari artikel-artikel bersitasi tinggi di tiga jurnal publikasi internasional di bidang sumber daya air menunjukkan bahwa hanya 10% dari total artikel yang direview mengintegrasikan parameter ekologi secara kuantitatif. Rendahnya persentase integrasi ekologi dalam penelitian di bidang sumber daya air disebabkan oleh tiga kesenjangan ilmiah, meliputi: (1) kesenjangan isu, dimana isu sumber daya air diperlakukan sebagai variabel empiris utama; (2) kesenjangan model, dimana air merupakan satu-satunya parameter yang dipertimbangkan dalam pemodelan; dan (3) kesenjangan data, yang terfokus pada permasalahan ketersediaan data ekologi untuk analisis. Tiga rekomendasi terkait dengan kesenjangan ilmiah ini meliputi: (1) memperkuat konsep ekohidrologi dengan memandang air adalah bagian tidak terpisahkan dari ekosistem bumi yang saling terkait, (2) mendorong integrasi parameter ekologi ke dalam pemodelan hidrologi, dan (3) pengembangan teknik peningkatan skala (resolusi) data yang terintegrasi dengan analisis ketidakpastian.

Kata Kunci: Hidrologi / Ekologi / Ekohidrologi / Ekosistem / Pemodelan Lingkungan

INTRODUCTION

The concept of integrated modeling to solve global environmental challenges is recently emerging. This concept suggests the use of integrative ecosystem model particularly to deal with seven global environmental issues, including climate change, soil security, water security, food security, energy security, biodiversity protection, and ecosystem services (McBratney *et al.* 2014). Water as the main driver in ecosystem processes is therefore being discussed.

For centuries scientists have been and being in research of water cycle to unfold its processes in regulating ecosystem and environment evolution. Two third of the earth surface is covered by ocean, while it presents not only providing habitat for the sea biota, ocean also regulates the earth climate which make it possible to be inhabited by other species including human. Ocean water is able to buffer temperature, while the differences from terrestrial counterpart, regulate the wind pattern which eventually distributes evaporated water as rain (Archer *et al.* 2010). The condense atmospheric water then fall and precipitate on

the terrestrial carrying dissolved atmospheric gases such as oxygen, carbon dioxide, and nitrogen, changing its chemical composition, and have the ability to react with the earth surface to develop soils (Brady 1984). In the soil, the water-driven redox reactions provide nutrient as a byproduct, which together with available water, CO₂ gases, and the energy from the sun, enable plants photosynthesis to provide food for human and animals. While not all terrestrial water are used by trees, the excess precipitation are either evaporated back to the atmosphere, absorbed by soil to be stored as groundwater through subsurface flow, or generate runoff which eventually return to the ocean following the river path (Chow *et al.* 1988).

While the strong coupling between hydrology and environmental ecology has been known for centuries, the concept of ecology-hydrology integration, also known as ecohydrology, has just been coined in the last decades of the 20th century (Eggelsmann 1987). Ecohydrology formerly was known for ecologist who study wetland, in which it only considered plant and water relationship. It was defined as interdisciplinary science which study ecology in hydrology point of view, by taking interrelationship between hydrology and ecology (Grootjans *et al.* 1996). Later on, it was also argued that the interconnection between ecology and hydrology had to be applied in two ways, in which ecohydrology does not only studying plants effect to hydrological processes, such as through-fall, infiltration, and sedimentation; it also focuses on the influence of water quality and regime to the vegetation pattern (Wassen 2000). Furthermore, the climate and soil dynamics also included in this integrative ecosystem study (I. Rodriguez-Iturbe 2000), and the human factor was then also integrated in the definition, particularly to achieve water sustainability in catchment scale (Zalewski 2000).

The objective of this article, therefore, is to review the hydrological research findings during the past decade to uncover the trend of water related research toward integrative ecosystem modeling. Furthermore, this review is also intended to find gaps between hydrology and ecology research toward integrative ecosystem modeling. A literature review methodology will be described in the next chapter, followed by the result and discussion about what the trending issues in hydrology, the problem scales, the used model paradigms for the problem-solving analysis, and whether ecological aspects were directly included or not in each of the reviewed research.

LITERATURE SOURCES AND THE OVERARCHING QUESTIONS

The literature review was conducted following another similar methodology (Grunwald 2009), with slight modification to fit the topic of this article. Literature search was done in the publication database website, Web of Science (<http://apps.webofknowledge.com/>). First, publications under Water Resources category were selected based on the journal impact factor (JIF), by using Journal Citation Report (JCR) year 2013. Three publications were then selected including Water Resources Research (JIF 3.709), Hydrology and Earth System Sciences (JIF 3.642), and Advances in Water Resources (JIF 2.780). For each of these publications, non-review articles which are categorized as Highly Cited Paper during the past decade (2004-2015) were then selected and reviewed.

Total 56 papers were under reviewed to answer 6 main questions, including (1) what is the main hydrology topic, (2) what is the water component being discussed, (3) what is the issue being resolved, (4) what is the scale of the problem, (5) which modeling paradigms are used for the problem-solving analysis, and (6) what ecological factors are included in the discussion. Along with these six main questions, other parameters including the location of the research, the dataset being used, the used hydrologic models, and the major research finding were also investigated to support the discussion. Four categories were used to answer the first question, including water quantity, quality, uncertainty analysis, and model development, while second question defined which components of water cycle were discussed related to its category. Furthermore, the specific water related issues, including the problem scales, and the proposed solution were described in question three to five. Finally, the last question was used to investigate whether ecological factors were directly or indirectly, quantitatively or qualitatively discussed in each of the reviewed article.

HYDROLOGY RESEARCH MAINSTREAMS (2004-2015)

The list of reviewed literatures, categorized based on the topics and water cycle components, are presented in Table 1. This data shows that more than 55% of the reviewed articles are under water quantity category, while other 20%, 16%, and 9% respectively discuss water quality, uncertainty analysis, and model

Table 1. List of the reviewed literatures based on water topic and water cycle component category

Tabel 1. Daftar literatur berdasarkan topik air dan kategori komponen siklus air

Category	Total	Articles
Model development	5	
Soil water	5	(Benson <i>et al.</i> 2013; Revil 2013; Liang <i>et al.</i> 2009; Neuman <i>et al.</i> 2009; Revil 2012)
Uncertainty analysis	9	
Surface water	6	(Schoups <i>et al.</i> 2010; Neuman <i>et al.</i> 2012; Blasone <i>et al.</i> 2008; Pappenberger <i>et al.</i> 2006; Bastola <i>et al.</i> 2011; Renard <i>et al.</i> 2010)
Soil water	3	(Dorigo <i>et al.</i> 2010; Vrugt <i>et al.</i> 2008; Zhou <i>et al.</i> 2011)
Water quality	10	
Soil water	7	(Lutz <i>et al.</i> 2013; Chalbaud <i>et al.</i> 2009; Blunt <i>et al.</i> 2013; Akbarabadi <i>et al.</i> 2013; L. Li, Peters <i>et al.</i> 2006; Pini <i>et al.</i> 2012; Pau <i>et al.</i> 2010)
Groundwater	3	(Robinson <i>et al.</i> 2007; Navarre-Sitchler <i>et al.</i> 2013; Siirila <i>et al.</i> 2012)
Water quantity	32	
Atmospheric water	6	(Andreadis <i>et al.</i> 2006; Christensen <i>et al.</i> 2007; Essery <i>et al.</i> 2013; Rittger <i>et al.</i> 2013; Maurer <i>et al.</i> 2008; Marks <i>et al.</i> 2013)
Surface water	12	(Di Baldassarre <i>et al.</i> 2009; Ghosh <i>et al.</i> 2008; Yadav <i>et al.</i> 2007; Brocca <i>et al.</i> 2010; M. P. Clark <i>et al.</i> 2008; Villarini <i>et al.</i> 2009; Labat <i>et al.</i> 2004; Moradkhani <i>et al.</i> 2005; Kirchner 2009; Ward <i>et al.</i> 2014; Y. P. Li <i>et al.</i> 2006; Lazure <i>et al.</i> 2008)
Soil water	11	(Brocca <i>et al.</i> 2010; Chang <i>et al.</i> 2006; Donohue <i>et al.</i> 2006; Knudby and Carrera 2005; Liu <i>et al.</i> 2011; Lü <i>et al.</i> 2011; Mekonnen <i>et al.</i> 2011; Nagarajan <i>et al.</i> 2011; Van Dijk <i>et al.</i> 2013; Xu <i>et al.</i> 2008; Hrachowitz <i>et al.</i> 2013)
Groundwater	3	(Voss <i>et al.</i> 2013; Chen <i>et al.</i> 2006; Kollet <i>et al.</i> 2006)
Grand total	56	

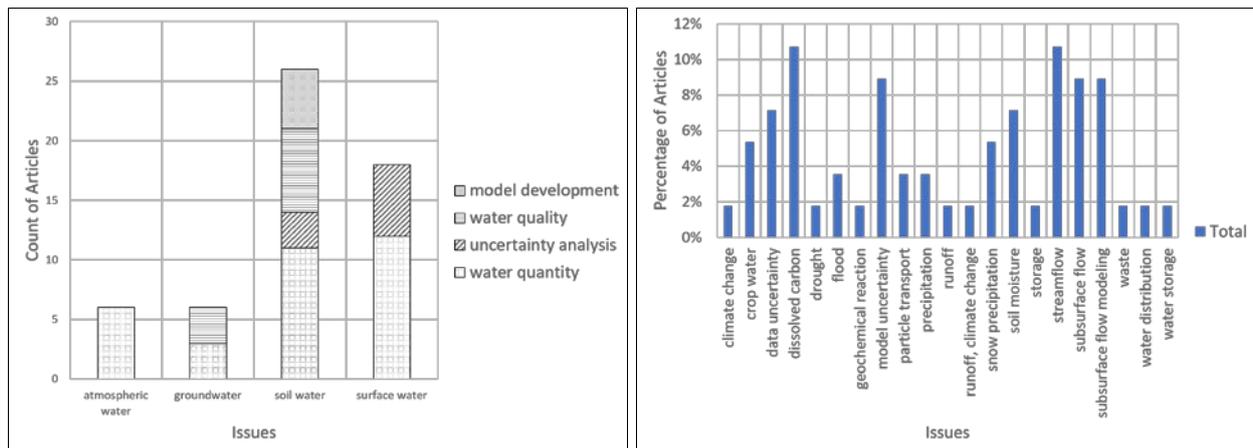


Figure 1 The number of articles for each hydrology research topics related to water cycle component being discussed (left), and the trending issues in water research (right)

Gambar 1. Jumlah artikel untuk setiap topik penelitian hidrologi terkait dengan komponen siklus air (kiri), dan isu terkini pada penelitian hidrologi (kanan)

development. Moreover, almost 75% of articles within water quantity category discuss surface and soil water, but soil water itself becomes major topic within all of each category under reviewed. The relationship between research topics, water cycle components, and the water related research trending issues are shown in Figure 1.

The left chart on Figure 1 shows that more than 46% of the reviewed articles address soil water as the main subject, followed by 32% about surface water, and 11% for each about groundwater and atmospheric water. For the water related issues (right chart), three groups based on the number of articles are identified. Ordered from the highest trend, the trending topics

include dissolved carbon and streamflow; model uncertainty, subsurface flow and modeling; and data uncertainty and soil moisture. Furthermore, the trend of the problem scales and model paradigms being discussed related to the water cycle component are presented in Figure 2.

The left chart of Figure 2 shows that 43% of reviewed articles discuss water related problems in the landscape scale, while other problem scales being discussed include watershed, regional, global, and laboratory scale, with percentages of 27%, 16%, 9%, and 5% respectively. In term of modeling paradigms, process based model is the favorite followed by factorial

model, with almost 59% and more than 14% of the use in the reviewed articles, respectively.

Figure 3 shows the number of articles which directly include ecosystem as the modeling parameters, whether qualitative or quantitative, and the related ecosystem parameters being discussed. It can be seen from Figure 3 that more than 80% of articles under review do not include ecosystem in their discussions, while only about 10% of the ecosystem discussion are quantitative, which directly include ecosystem parameters into the modeling. Furthermore, right side chart of Figure 3 also shows that the relationship between soil water and plants is the mostly discussed research topic.

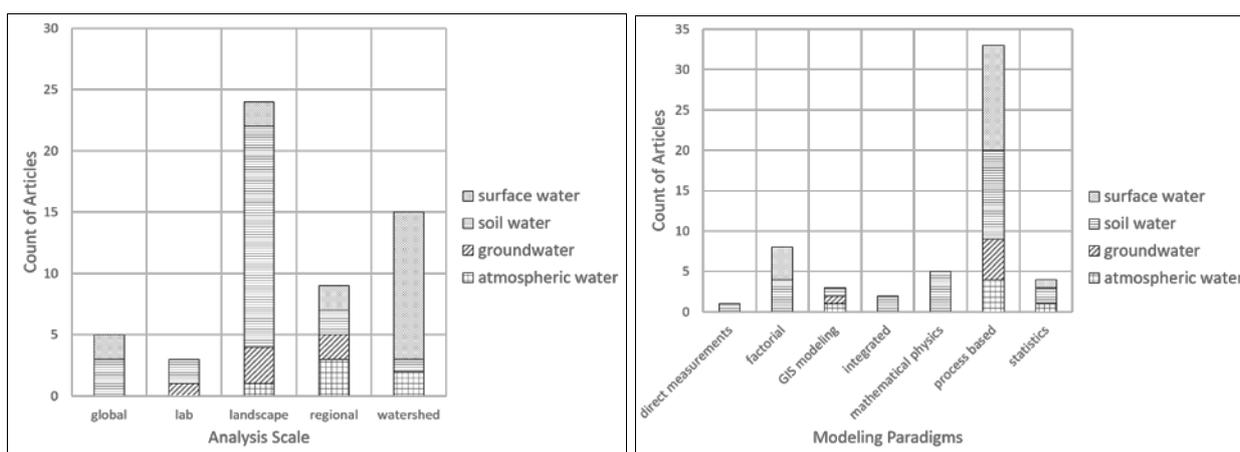


Figure 2. The trend of problem scales (left) and model paradigms (right) related to water cycle components being discussed in hydrology research

Gambar 2. Tren skala permasalahan (kiri) dan paradigma pemodelan (kanan) terkait dengan komponen siklus air pada penelitian hidrologi

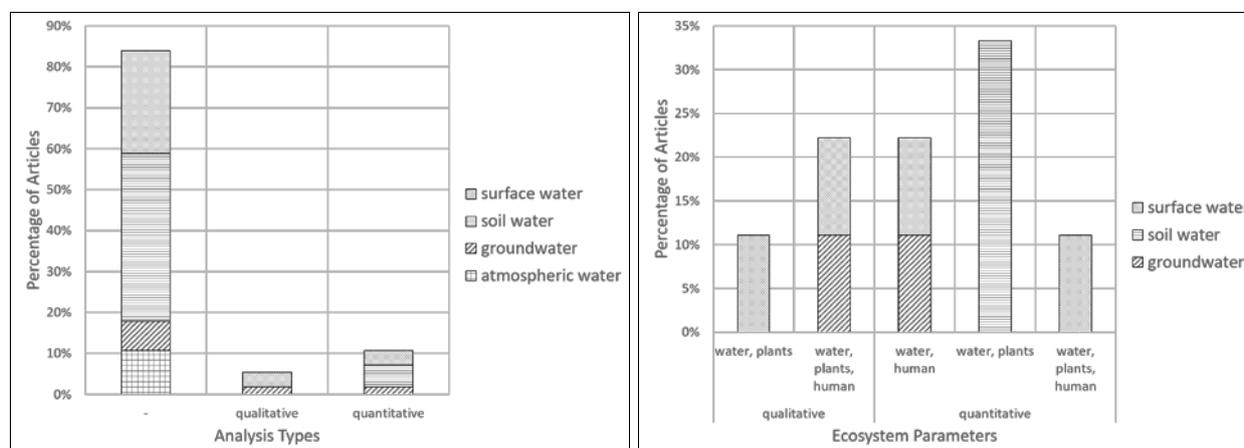


Figure 3. The percentages of articles directly discuss ecosystem (left) and the ecosystem parameters directly included in the reviewed articles (right)

Gambar 3. Persentase artikel yang secara langsung membahas tentang ekosistem (kiri) dan parameter ekosistem yang dibahas (kanan)

CURRENT STATUS OF THE ECOLOGY AND HYDROLOGY RESEARCH INTEGRATION

Atmospheric Water

In the past decades, no more than 11% of hydrology research discuss atmospheric water. Furthermore, process based modeling was used in 66% of the reviewed articles to model atmospheric water, while other modeling paradigms being used include Geographic Information System (GIS) modeling and statistics. Moreover, all the articles related to atmospheric water discussed issues about the quantity of the rain/snow precipitation, but there are no articles which directly address ecological factors as the model parameters.

In term of scales, 50, 33, and 17% of methods which were used to model atmospheric water were applied in regional, watershed, and landscape scale, respectively. These articles mostly used coarse data, such as low-resolution satellite imageries, to assess the change of water responses. For example, sequential MODIS data were used to characterize snow to understand the earth energy processes using geostatistical method (Rittger *et al.* 2013) and to minimize bias on snow forecasting based on process based modeling in the regional scale (Andreadis *et al.* 2006), while future prediction of precipitation and temperature from general circulation model were used as input for process based watershed modeling to forecast runoff responses due to climate change (Christensen *et al.* 2007).

Surface Water

About 32% of the total reviewed articles discussed surface water, with 67% and 33% of it dealing with water quantity and uncertainty analysis, respectively. The discussed surface water issues include 44% of about the streamflow and runoff processes, 33% of about model and data uncertainty analysis, 11% of about flood, and 6% for each of about the relationship between surface water, soil water and water distribution. Moreover, about 67% of the surface water related research were done in watershed scale.

Regarding to the modeling paradigms, more than 72% of the articles used process based modeling during the problem-solving analysis, while other modeling paradigms include factorial model and traditional statistics, with the percentages of 22 and 6% respectively. Furthermore, while only about 7% of the

used process based model directly included ecosystem parameter, 75% of the applied factorial model included ecosystem factors within its discussion, although 67% of it are qualitative. These factors include human and plants and its relationship to water. For example, the crop water need and domestic water demand were included in the interval-parameter multi-stage stochastic linear programming (IMSLP) model to develop regional water allocation decision support system (Y. P. Li *et al.* 2006), while the qualitative relationship between water, human, and plants factors were included to assess flood in the global scale (Ward *et al.* 2014) and another quantitative ecosystem modeling in watershed scale (Villarini *et al.* 2009).

Soil Water

Soil water was the most discussed water cycle component in hydrology research during the past decade, with more than 46% of the total reviewed articles took water in the soil into account. Soil water was also discussed in all problem scales, with almost 70% of it were done in landscape scale. Furthermore, soil water was also always included in every hydrology research topic, with most of it discussed soil water quantity, followed by soil water quality, model development, and uncertainty analysis. The issues included in these topics were dominated by subsurface flow modeling, followed by water quality related to dissolved carbon, soil water distribution, soil water-plants modeling, and the uncertainty of soil water data and models. Other minor issues include waste water, drought, and water driven geochemical reaction.

In term of modeling paradigms, soil water always had model representative on all of the identified method. While it was dominated by process based modeling, other method being used to model soil water include mathematical physics, factorial model, integrated model, traditional statistics, and GIS model. Furthermore, although soil water becomes the dominant category in the reviewed hydrology research articles during the past decades, only about 11% of the research directly included plants as an ecological factor in its modeling parameter; but was quantitatively defined. Moreover, the soil water related ecosystem model being used in these articles were dominated by process based model, which was applied in both global and landscape scale, and another integrated modeling was used to assess soil water in regional scale. For example, process based model was used to quantify

green, blue, and grey water global distribution of 126 agricultural crops products using crop coefficient, transpiration reduction factor, reference evapotranspiration, and total available water capacity data as the model input (Mekonnen *et al.* 2011), while another article discussed the assimilation of vegetation dynamics to downscale Budyko's hydrological model into the landscape scale (Donohue *et al.* 2006). Another example in the regional ecosystem modeling includes the integration of the result of process based and factorial model to discuss the impact of natural and anthropogenic driven drought to the ecosystem in the southern Australia (Van Dijk *et al.* 2013).

Groundwater

Together with atmospheric water, the groundwater issue was the least topic being discussed in the reviewed articles. These issues were mostly addressed in landscape scale, followed by regional and laboratory scale; with the most used modeling paradigm was the process based model. Furthermore, GIS method also being used to model groundwater in regional scale. Regarding the ecosystem model, only about 33% of these articles included ecosystem in their discussion, quantitatively. For example, a process based model of carbon dioxide leakage into groundwater was addressed in the laboratory experiment, to model aquifer drinking water quality impacting human health (Navarre-Sitchler *et al.* 2013), while geospatial technique was used to monitor water availability to asses agricultural water use conflict in regional scale (Voss *et al.* 2013).

SCIENTIFIC GAPS AND FUTURE CONSIDERATIONS IN THE INTEGRATED ECOHYDROLOGY RESEARCH

The reviewed data show that only 10% of total number of the reviewed articles quantitatively integrate ecosystem parameters into the hydrologic model, and the number does not have positive trend in the past decade. Although the concept of ecohydrology has been around for more than 25 years, scientific gaps toward integrating hydrology and ecology research persist. Here, the gaps and future considerations toward ecohydrology concept based on the reviewed articles are presented as follows:

1. In most of the research articles which exclude ecological factors, water is treated as an individual empirical or state variable, particularly in the articles which focus on water quantity. This point of view leads hydrologists to model only water without considering other ecosystem parameter which might be influenced by or influencing water. However, this view can be broadened by viewing water as natural capital, so that other factors serviced by water then might be considered during the modeling processes.
2. In most of the used modeling paradigm, ecosystem parameters are not directly included in the model, which create modeling gap towards ecohydrology concept. The integrative model that combine ecosystem model and hydrology model might solve the problem, by using the output of water model as the input of ecology model or vice versa, or by assimilating water or ecosystem parameter to model ecosystem or water, respectively. Therefore, as it has been discussed in the previous point, this approach needs to treat water together with biotic and abiotic parameters related to water as a natural capital, which focus on the ecosystem services provided by each parameter.
3. There is certain issue with data availability and resolution, which leads to scaling problem and increase the modeling uncertainty. Most of the hydrology models rely on empirical point observation, which use lumping technique to model water related processes in certain extent of area. This method somehow hides the influence of other biotic or abiotic variables which might be included during the modeling. The use of distributed modeling and GIS techniques have had intention during recent studies, but the data availability, especially with satellite imageries, becomes the limited factor. For example, crop species and soil water availability data are needed to model crop water interaction using geospatial model. While satellite imageries providing crops images are available up to less than a meter resolution, the best available soil water imagery is in 9 km resolution (Entekhabi *et al.* 2010), which the mission was just launched on January 2015. Therefore, to accommodate ecosystem modeling, there is certain need to develop a downscaling and upscaling technique which consider data uncertainty analysis, to match the scale of both available data.

CONCLUSIONS

Literature review of highly cited articles from three high impact factor publications in water resources category during the past decade shows that process based modeling used to model water quantity are dominant in water related research. However, only 10% from the total articles under reviewed, directly included ecosystem parameter quantitatively. Based on the provided data, three main scientific gaps are then identified. First is the issue gap, in which water are treated as individual empirical or state variable which hide ecosystem parameters. Second is the model gap, in which only water is directly included in model parameter. Third is the data gap, in which available data resolution does not match to the ecosystem problem scale. Therefore, future research should treat water as natural capital, which then broaden the research point of view to integrate ecosystem parameters in the water modeling processes. Furthermore, there is a need to improve data upscaling and downscaling techniques which include data and model uncertainty analysis to control the quality of the result.

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