

**News Media Coverage of Conflict and Cooperation Dynamics of Water Events in the
Lancang-Mekong River Basin**

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Submitted to *Hydrology and Earth System Sciences*

Special issue: Socio-hydrology and Transboundary Rivers

Abstract

Riparian countries have their respective values and priorities for water management, and their values of shared water often has possible impacts for their propensity to involve in cooperative management and adhere to treaties/agreements. However, there are limited understanding of the changing values and interests of each riparian country. This paper aims to analyse the evolution of conflict and cooperation dynamics in Lancang-Mekong River Basin the perspectives of multiple countries. Newspaper articles were used as the key data source as it provides insights into events reported on by the media that are representative of each country/sector they are published within. The results depict a trend of cooperative sentiments towards water events occurring within the region. The six riparian countries (China, Myanmar, Laos, Thailand, Cambodia, Vietnam) have had a greater average sentiment score (0.5) for cooperation than international countries (0.16) for the majority of the study period. The trend also shows that countries further downstream showed lower cooperative sentiments except for Vietnam (China 0.86, Myanmar 0.58, Laos 0.46, Thailand 0.34, Cambodia 0.13, Vietnam 0.91). Dam infrastructure was often negatively reported (60% of negatively reported articles), thus, it is likely a major contributor to conflict for the Lancang-Mekong River Basin, while events that are positively reported are those that aid in connecting leaders and project developers between riparian countries including meetings, bilateral and multilateral cooperation and development projects. These findings provide the basis for further revealing the mechanism of cooperation and conflicts among riparian countries in order to more proactively manage cooperation/conflict in transboundary rivers.

Keywords: transboundary river management, conflict and cooperation, Lancang-Mekong river basin, newspaper, sentiment analysis, societal value, big data

1. Introduction

Globally there are 310 transboundary rivers that flow across more than 47% of the world's land surface (McCracken and Wolf, 2019), providing approximately 60% of the global river flow (Wolf et al., 2005). Transboundary rivers flow across political boundaries with spatial and temporal variance, often resulting in very different views on how the transboundary water should be used, and how it should be managed among its riparian countries (Sunchindah, 2013). Tensions and uncertainties often occur when sharing this consumable, indispensable resource and compounded by the dynamic interaction of hydrological, technical and social systems (Zeitoun and Mirumachi, 2008). Transboundary rivers are therefore characterized for evolving cooperation and conflict dynamics (Wolf et al., 1999; Petersen - Perlman and Wolf, 2015; Yoffe et al., 2003; Zeitoun and Mirumachi, 2008).

Understanding transboundary waters through the lens of conflict and cooperation has been a dominant approach embraced by many scholars in different disciplines (Wolf et al., 2003; Yoffe et al., 2003; De Stefano et al., 2010; Zawahri, 2008; Gleick, 1998). As the first and fundamental advance to analyse the tendency for conflict or cooperation along international rivers, some inventories have been built up to provide global snapshot of conflict and cooperation dynamic to recognise future tensions. Often cited is the Transboundary Freshwater Dispute Database (TFDD) developed by Oregon State University (Wolf, 1999) that compiled historical water incidents, both conflictive and cooperative, on a global scale from 1948 to 2008. Based on the data, Basin at Risk Projects (BAR) (Yoffe and Larson 2001) categorised intensities of water incidents, varying between -7 and +7, in order to understand possible social - political threats. Underpinned by the recognition that cooperation and conflict are not a binary construct, as all-or-nothing (Grey and Sadoff, 2002), but rather in co-existence, in their Transboundary Waters Interaction Nexus (TWINS) tool, Zeitoun and Mirumachi (2008) attended to the nexus of water conflict and cooperation underlining the dual nature of interaction.

However, current event-based approach is inadequate to recognise the nuance nature of conflict and cooperation instances, i.e., lack of understanding of each riparian country's attitude/value toward the shared river. Simply classifying water events into conflict or cooperation could mask various forms of conflictive or cooperative responses elicited from each riparian country

underneath (Watson et al., 2009). Riparian countries have their respective values and priorities for water management (Wolf et al., 2005; Di Baldassarre et al., 2013), and their attitudes toward shared water often has possible impacts for their propensity to involve in cooperative management and adhere to treaties/agreements. Understanding value in the context of transboundary river basins is therefore vital for developing effective management and policies toward cooperation (Bennett and Dearden, 2014; Hartley, 2006; Larson et al., 2009; Turner et al., 2014).

Values, arising from the concept of culture along with norms and beliefs, posit as deeply held ideas that influence on water management decisions and outcomes (Caldas et al., 2015; Roobavannan et al., 2018; Wei et al., 2017). Shaping the way people see, perceive and interpret the outer environment (Caldas et al., 2015), value is considered as a mediating variable that connect human with the natural environment. In the context of transboundary rivers, where multiple water users are interconnected (Petersen-Perlman et al., 2017), their different values towards their shared water are often manifested as conflictive or cooperative attitudes toward other competing water users. When further complicated by the interdependent web of hydrological, political, economic, technical, and social processes (Dinar, 2004; Di Baldassarre et al., 2019), that could result in greater cooperation or conflict at basin-scale. Improving transboundary water management therefore firstly requires nuance understanding the changing values and interests of each riparian country, however, it remains under researched. An in-depth analysis that looks into each riparian country's conflictive or cooperative perspectives is key to understand their cooperative or non-cooperative behaviour.

Recently, conflict and cooperative dynamics in transboundary rivers have also been considered as a socio-hydrological phenomenon (Di Baldassarre et al., 2019), emerged as a result of the long-term evolution of hydrological, political, economic, technical and social processes settled within the transboundary river system (Di Baldassarre et al., 2019). Socio-hydrological approach, which emphasize the feedback mechanism between human and water system, is thus proposed to unravel how and why different actors came into cooperation. However, challenges exist in how to measure value as the key social element in the socio-hydrological approach for developing the transboundary socio-hydrological models.

Therefore, this paper aims to provide a new perspective to understand the conflict and cooperation dynamics by highlighting each country's conflictive or cooperative attitude towards their shared water. Lancang-Mekong River Basin is taken as a case study to investigate how the conflict and cooperation dynamics has changed over time and the main issues associated with the conflictive and cooperative sentiments. This paper can serve as a reference for water managers to collaboratively identify, manage and overcome potential conflict to achieve effective transboundary water management. It can also serve as a reference to measure the value in the social-hydrological approach to contribute to understanding the mechanism that drives the conflict or cooperation choices in the long run.

2. Case Study Area - Lancang-Mekong River Basin

The Lancang-Mekong River is one of the largest and longest river systems in South-East Asia. It flows from Tibetan Plateau in China, down 4,880 km through Myanmar/Burma, Lao PDR (Laos), Thailand, Cambodia and exiting into the South China Sea through Vietnam (MRC, 2019b), as seen in Figure 2. The river course that runs within China is named Lancang River, whilst river course flows through downstream is referred as Mekong River. The Lancang-Mekong River is an essential water source that supports the livelihoods for some 65 million people from the six riparian countries in maintaining food security and nutrition (Dugan et al., 2010).

The Lancang-Mekong River has experienced a lengthy record of conflictive and cooperative events, see Figure 3. Significant movement towards cooperation over water resources between the riparian countries primarily began in the 1950s when the Mekong Committee was established, consisting of the lower Mekong countries, after the Geneva Convention granted independence to Laos, Cambodia, and Vietnam (Hirsch and Cheong, 1996). This committee ran from 1957 to 1978 despite disagreements among the riparian countries in how the decision-making processes were implemented (Yorth, 2014). In 1995, all members of the Mekong River Commission (hereafter, MRC) signed the "Agreement on the Cooperation for the Sustainable Development of the Mekong River Basin" (Hirsch and Cheong, 1996), with China and Myanmar presenting as

Dialogue Partners of the MRC throughout discussions (Yorth, 2014). The beginning of the 21st Century has marked China's cooperative commitment for providing 24-hour water level and 12-hour rainfall data as well as entering cooperative regimes with the MRC (Dore, 2003). Meanwhile, construction of large-scale dams in upstream has received mounting criticism, i.e., the Xayaburi Dam, as the first of the eleven proposed cascade dams on the Lower Mekong began construction in 2010 despite a lack of agreement between all four lower Mekong countries and failure of the regional consultation process. After that, several treaties and plans were signed, including the Lancang-Mekong Water Resources Cooperation Centre in 2017 and the formation of the Lower Mekong Committee (LMC) framework, marking a significant step towards cooperation.

One of the most prominent reasons behind the tension between the riparian countries is their competing desires for the use of the water. China in particular has an interest in hydropower projects to generate electricity and also in clearing and expanding waterways to improve navigation for greater trade (Yorth, 2014). Myanmar, with access to part of the Lancang-Mekong River through the share of a border with Laos, has not projected a preferred use of the water vocally but is generally cooperative with China (Yorth, 2014). Laos, similarly to China also has a great interest in hydropower developments and are in a position favourite to alter the downstream flow of the Mekong River (Dugan et al., 2010). Thailand primarily diverts water from the main Lancang-Mekong tributary into its North-eastern areas for irrigation (Nesbitt, 2005). Cambodia has a particular interest in preserving water quantity and quality for their fisheries sector to ensure aquatic species abundance (Yorth, 2014). As a result, Cambodia demands that fewer large structures are constructed along the Lancang-Mekong, such as dams and irrigation systems that may affect the sediment flow and water quantity downstream (Yorth, 2014). Vietnam has an interest in utilizing the water for agriculture and aquaculture and generally contests upstream dams that will have an effect on its water quantity for irrigation and aquaculture and its flood control abilities (Nesbitt, 2005).

3. Methods

Newspaper articles provide insights into events reported on by the media that are representative of each country/sector they are published within (Cooper, 2005). Through its noted “agenda-setting” capability, newspaper reflect what is important to the public as well as it shapes the public perception of an issue (Bengston et al., 1999;Hurlimann and Dolnicar, 2012;Neuendorf, 2017). Newspaper has increasingly been recognized as a valid proxy to track societal values or public opinion (Wei et al., 2015;Wei et al., 2017;Quesnel and Ajami, 2017). Thus, utilizing newspaper articles as a key data source allows the analysis of the perceptions of different countries pertaining to water events over time.

This paper takes newspapers as data sources to uncover the conflictive and cooperative sentiments and associated topics in news coverage through sentiment analysis and topic analysis. The search did not limit the timeframe but aim to include all that is relevant in discussing conflict/cooperation water events. The step-by-step illustration of how the data is collected and analysed is given in Figure 1. First of all, newspaper articles were collected from a database using pre-defined keywords, which resulted in total of 12,314 articles. All of these articles were then manually read by authors to remove irrelevant and duplicates articles based on pre-determined criteria, which left 3877 articles for final analysis. These articles were classified based on their origin of publication, and the conflictive and cooperative sentiments expressed from these articles were then determined using sentiment analysis, and the main topics associated with conflict/cooperation were analysed using topic analysis. More detailed step-by-step information were illustrated in each section below.

2.1 Data Retrieval

The Lexis-Nexis database was selected to extract newspaper information, which is home to more than 6000 news publications around the world and is among most commonly used news sources in the field of social sciences (Weaver and Bimber, 2008;Racine et al., 2010). Searching scope include both major regional and international English newspapers. Although English is not frequently used in most riparian countries, English newspapers are accessible and regularly reach an international audience, and is therefore considered a reference to the government's foreign

policy (Curtin, 2012). News articles in these newspapers reflect national interests and political responses that riparian countries want to deliver to the international public.

The search terms are one of the key determinants of the validity of the data to be collected. The search terms used in this study, as seen in Table 1, were adopted from Yoffe and Larson (2001) and refined to enable the results to water events along the Lancang-Mekong river related to conflict and cooperation between riparian countries. Specifically, the search terms requires articles to be included must discuss “Mekong” river basin in one of topics indicated below, such as dam, irrigation, pollution, etc. These articles need to discuss the conflictive or cooperative aspects of the events involving at least one of riparian countries. The above categories can narrow down the search to the desired scope, with the list of unwanted words further screen out irrelevant topics.

2.2 Data Cleaning

Initially, the search generated a total of 12,316 results. To further ensure the accuracy of results, all articles were then manually read and examined for their relevancy to ensure the sentiment analysis to be conducted would be reflective of the perspectives of water events along the Lancang-Mekong. Those articles not relevant were removed from the analysis alongside any duplicate articles and those with missing necessary information including article body and date published. The relevancy of each article was determined using the criteria in Table 2. The final number of articles utilized for the analysis was 3,877.

2.3 Sentiment Analysis and Topic Analysis

Generally, there are two ways of coding available when examining the news content, manual coding and computer-assisted coding. While manual coding could uncover latent content to a larger extent (Wei et al., 2015; Wei et al., 2017), it is more time consuming and less efficient when examining large datasets. Sentiment analysis, a widely used computer-based analysis, was utilized in determining the cooperative or conflictive perspectives towards water events, and how they have changed over time. Sentiment analysis is the process in which thoughts, attitudes and

perceptions expressed in a text are identified and classified in a computational way, particularly in order to determine authors' viewpoints and position towards certain issues (positive, negative, or neutral) (Danneman and Heimann, 2014). The sentiment analysis was conducted through the interface of R. The process involved inputting textual data into the program, tokenising the sentences to differentiate each word from one another, and then attaching the tokenised text to a sentiment lexicon to identify the overall sentiment (Danneman and Heimann, 2014). As there is no "conflict and cooperation" lexicon for transboundary rivers available, a general sentiment lexicon AFINN was utilized in this analysis. AFINN contains a total of 2,477 attached word-sentiments, which produces a positive and negative value on a scale from -5 to +5 (Nielsen, 2011). In order to represent the conflictive and cooperative sentiments, the searching scope has limited the articles content to instance of cooperation or conflict that occurs within an international basin involving one or more riparian to that basin. Therefore, the calculated sentiment scores based on AFINN scores ranging from - 5 to + 5 was considered being able to reflect the intensity of conflict and cooperation accordingly.

To reflect topics associated with conflict or cooperation in water events, topic analysis - Structural Topic Modelling (STM) (Roberts et al., 2014) was utilized. Structural Topic Modelling (STM) allows frequent words to be extracted from text, identify commonalities between the words, phrases and groups of words to generate a topical prevalence and topic content factor (Roberts et al., 2013). This tool is particularly useful when managing big data sources as the process to identify key topics manually is inefficient and time-consuming, whereas STM has the ability to identify topics automatically. The STM was processed by using the STM package in R (Roberts et al., 2014). The number of topics selected was ten which was decided through an analysis of the topics produced until clear, relevant topics emerged as a result. For example, at five topics, all topics were pertaining to water, resources, and the six riparian countries; however, at ten topics, there were more clear events emerging such as dam infrastructure, agriculture and fisheries. The topics were then manually labelled based on the most frequent words found within each topic as the statistical software cannot extrapolate the overall topic from most frequent

words. This topic classification was based on previous literature reviews and the main water-related topics outlined in Wei et. al.'s (2015) study.

4. Results

4.1 Overall News Coverage of Conflict/Cooperation Water Events on Lancang-Mekong River Basin

Overall, there was an observed increase in both the number of conflictive and cooperative articles published over time. There has consistently been a greater number of articles with cooperative sentiment than conflictive sentiments since 2002 (Figure 4). This ratio of cooperative to conflictive articles published has remained relatively stable since 2000 with majority of all years having 60% to 70% of all articles being cooperative. There are also multiple peaks and troughs in terms of the proportion of cooperative and conflictive reported articles shown in Figure 4, peaks were reached in year 2004 and 2015, troughs were found in year 2011.

4.2 Topics Associated with Conflict/Cooperation Sentiments

To understand the most concerned topics associated with conflict/cooperation sentiments, topic analysis was conducted with ten topics identified. It was found that nearly one third of all articles were pertaining to dam infrastructure, implying that this is a significant topic that countries have a vested interest in (Figure 5a). Following this there is a large proportion of topics that are associated with the reporting of relationships between countries or their cooperation. i.e. bilateral relations, multilateral relations, joint management and meetings.

Figure 5b also depicts the proportion of topics that are frequently associated with conflictive sentiment. Dam infrastructure and hydropower, which operate hand-in-hand, were negatively reported by the media accounting for 60% of the total topics. Whilst another 10% of all negative articles had a focus on meetings, bilateral relations, flooding and fishing/environment. When analysing the major topics that prompt a greater cooperative sentiment towards water events in the media, it is clear that there are five main topics that are focused on: development, meetings,

hydropower, bilateral cooperation and multilateral cooperation (Figure 5c). Development, meetings and hydropower all are key topics, accounting for 22.22% of topic relevance to articles.

4.3 Dynamics of Conflictive and Cooperative Sentiments as Perceived within and beyond the Basin

Conflictive and cooperative sentiment as reflected within and beyond the basin countries was calculated to reveal detailed insights into the evolving perspectives, as seen in Figure 6a. It was observed that from 1991 to 2018 there is an apparent trend in increasing cooperative sentiment scores for both international (beyond the basin) and regional (within the basin) publications (Figure 6a). There has also been decreased variability in the average sentiments over time with a similar sentiment score between 2008 and 2018 approximately. The six riparian countries have had a greater average sentiment for cooperation than international countries for the majority of the time scale showing that the region perceived transboundary water management in the Lancang-Mekong River Basin more positively than global audiences. This figure also highlights some of the key players in transboundary river basin management for the Lancang-Mekong region such as Australia and the United States of America (Figure 6b). Both Australia and the United States of America are development partner of the region and thus positively involved in the water management. Philippines is one of the major publication places for the Asian Development Bank (ADB) which is a key player for funding and international aid and has been frequently mentioned in the publications.

4.3 Dynamics of Conflictive and Cooperative Sentiments as Perceived from Each Riparian Country

Most importantly, Figure 7 shows the average sentiment scores for each of the riparian countries from 1991 until 2018. The results showed that all riparian countries demonstrated mostly cooperative sentiment relating to water events in Lancang-Mekong River Basin with overall average sentiments scores from each riparian country in order of lowest to highest are Cambodia (0.13), Thailand (0.34), Laos (0.46), Myanmar (0.58), China (0.86) and Vietnam (0.91). Upstream

riparian countries, such as China, Laos, and Myanmar, are exhibiting more positive sentiments compared to the downstream countries, Cambodia and Thailand (Figure 7). However, one major outlier is Vietnam, the most downstream country, which exhibits the highest sentiment value among all riparian countries. With the exception of Vietnam's sentiment score, the trend shows that countries further downstream show more conflictive sentiments. China has also consistently expressed very positive sentiments relating to water events in Lancang- Mekong River Basin over time (Figure 8). Upon inspection into the articles from China, predominantly published by Xinhua News, the Lancang-Mekong Cooperation (LMC) is a common occurrence in the text that contributes China's positive outlook on transboundary river basin management in the region. Thailand presents similar results, except for one year, 2011, which shows a negative average sentiment score. Laos' average sentiment scores between 2007 and 2018 were very variable and do not seem to follow any certain trend. Cambodia showed predominantly negative average sentiment scores as fishing issues has been a concerned issue cited in newspaper throughout the study period. Myanmar has minimal data with only 32 articles were found in total, and only one year, 2014, has shown a negative average sentiment score.

5. Discussion

It is important to understand the change of sentiments toward their shared transboundary water resources to be able to understand their cooperative or non-cooperative behaviour, the factors that encourage and discourage changes toward cooperation or conflict. This paper develops a new perspective to understand the evolution of conflict and cooperation dynamics with in-depth analysis of multiple countries. Key findings of this study are summarised below.

The overall sentiment analysis depicts a current trend of cooperative sentiments towards water events occurring within the region. This is in contrary with the previous studies in which the dominant trend in media coverage analysis was the decreasing of cooperative events from 1948 to 2008 (De Stefano et al., 2010). This research was able to bridge the gap in the literature and depict the trends that the proportion of cooperative to conflictive articles has not continue to drop but started to rise in favour of cooperative events. The reason behind is that dam construction and

infrastructure development are the key controversial issues as a majority of negative sentiments was associated with these topics, as reflected in topic analysis results (Figure 5b) and worldwide transboundary rivers (De Stefano et al., 2010). Therefore the absence and presence of dam related topics marks the ups and downs of the cooperation trend. Prior to 1990s, extensive headway was made towards cooperative actions with the establishment of the MRC with all lower Mekong countries and the adoption of associated treaties and agreements throughout its duration (Yorth, 2014). With an absence of dam proposals and construction prior to the 1990s and hence a significant source of conflict was absent during this time (Yorth, 2014). From 1990s, dam proposals and construction started to be discussed, which attracted concerns associated with infrastructure development along the river including limited sediment flow, lower water quality, the effect on fish species and livelihoods of people who rely on the river. After 2000, Mekong River attracted attention from the international community for its management and development, financial and infrastructure aids started flow in to assist cooperation within the basin. After 2014, new cooperation mechanism was proposed and implemented involving all basin countries. Cooperative sentiments expressed from the newspaper has been generally stable ever since.

As stated above, water events that are negatively reported on are associated with dam infrastructure (see Figure 5b) and thus, this is a major contributor to conflict for the Lancang-Mekong River Basin. This could be attributed to a variety of reasons. Historically, for all transboundary river systems, infrastructure and water quantity have been the most contested events occurring in rivers for their ability to alter the current water system and the significant downstream and upstream impacts (De Stefano et al., 2010). Primarily, major concerns over the construction of dams is associated with water quantity and the effects this has on sediment flux changes, water discharge, fisheries and water access for irrigation and agriculture (Yorth, 2014). Throughout the history of all dam proposals and construction in the Lancang-Mekong, it is found that not just the construction and operation of the dam that received a significant amount of negative media attention but also the proposal and planning process. Therefore, to ensure this pattern of conflict over dam infrastructure is minimized in the future, investments need to be made

in promoting the duty to notify, conducting proper consultation programs and producing impact assessments available publicly.

It was also found that the greatest events that are positively reported on by the media are those that aid in connecting leaders and project developers between riparian countries including meetings, bilateral and multilateral cooperation and development projects. Development is also generally viewed positively in the media due to the potential for desired growth and is promoted by many international NGOs including the ADB. In fact, the ADB aided in the establishment of the Greater Mekong Subregion Economic Cooperation in 1992 to focus on nine priority areas of economic growth along the Lancang-Mekong: transport, telecommunications, energy, tourism, human resources development, environment, agriculture, trade, and investment (Krongkaew, 2004). Thus, development is considered a crucial topic and action in providing greater cooperation and collaboration between riparian countries. By allowing this continual interaction and joint projects that facilitate riparian countries considering all interests and impacts on a larger, transboundary river scale, there is great potential for future cooperation to solve the current issues within the Lancang-Mekong Basin.

This study also differentiated between international countries and regional countries in how each topic was perceived by the media. It was found that basin countries on average have a higher cooperative sentiment score than international countries in each year from 1991 to 2018. This is likely associated with the topics that are considered ‘newsworthy’ to be published in a regional area, pertaining to another country. Generally speaking, when countries report on events not occurring within their close proximity and in different countries, they do so to focus on the major and complex issues and relationships that occur across the globe (Lewis, 2010). Hence, foreign news often focuses on significant instances of either great cooperative events such as international freshwater treaties and major strategic alliances, or significantly conflictive events including extensive war and hostile interactions of both physical and verbal nature (De Stefano et al., 2010). Given that 38.3 % of the total number of topics reported on are associated with meetings, bilateral relations, multilateral relations, joint management programs and local water resources as identified in Figure 5a, it is likely that these topics were not as ‘newsworthy’ or significantly

cooperative or conflictive enough to be reported on consistently by international countries. This understanding can allow for greater collaboration in realizing individual concerns of each country and distributing funding and aid accordingly and ultimately create greater collaborative water management schemes.

With the exception of Vietnam's sentiment score, the trend shows that countries further downstream showed lower positive sentiments. It was predicted that Vietnam and Cambodia would express negative sentiments, however, these expectations were not met in the study. The reason behind this pattern is that the true perspectives of some riparian countries including Vietnam and Cambodia could not be analysed as not many regional newspapers from those countries were accessible through Lexis-Nexis and as a result hinders the conclusions made. This is also one of the major limitations of this study that only English newspapers published in regional and international countries were included for analysis. For future research it is imperative that a greater variety of newspaper sources covering local languages are utilized through using multiple newspaper databases in order to gain a representative analysis of the perspectives of all riparian countries.

6. Conclusion

Understanding conflictive or cooperative responses is critical for establishing effective governance and policies for natural resources. This paper examined newspaper coverage in the conflictive and cooperative sentiments dynamics and its associated topics reflected from and beyond the basin countries. Results found that topics associated with dam construction and infrastructure development, including not only construction and operation but also planning and proposal process, are key controversial issues. Therefore the absence and presence of dam related topics marks the ups and downs of the cooperation trend. Water events occurring in Lancang-Mekong River Basin exhibited more cooperative sentiments during the study period. Riparian countries on average shows cooperative sentiments, whilst international countries tend to be more critical.

The future of the Lancang-Mekong is reliant on the riparian countries to collaboratively manage these resources. If the cooperative water events continue to increase and the issues associated with negative events can be collaboratively identified, managed and overcome, there is great potential for the region to achieve effective transboundary water management. As Kofi Annan, Secretary-General of the United Nations argued in 2002, "... the water problems of our world need not be only a cause of tension; they can also be a catalyst for cooperation...If we work together, a secure and sustainable water future can be ours" (Wolf, 2007).

Code/Data availability

The data and code used in this study is openly available.

Author contribution

Jing Wei, Yongping Wei and Fuqiang Tian designed research framework. Jing Wei, Natalie Nott and Claire de Witt collected data, conducted manual data sorting, and data analysis. Liying Guo and You Lu revised the code for data analysis. Jing Wei, Yongping Wei and Fuqiang Tian prepared the manuscripts with contributions from all co-authors.

Competing interests

The authors declare that they have no conflict of interest.

Acknowledgements

We would like to acknowledge the National Key Research and Development Programme of China (2016YFA0601603) and National Natural Science Foundation of China (NSFC 51961125204) for the funding and support of this research.

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Figure 3 History of Major Events within Lancang-Mekong River Basin

Figure 4 Proportion of Cooperation/Conflict articles published pertaining to water events along the Lancang-Mekong River Basin

Figure 5 The proportion of all topics identified as key topics in newspapers from 1991 to 2018 (a); The proportion of Topics Identified within all articles published with an overall conflictive sentiment (b); The proportion of Topics Identified within all articleThe proportion of all topics identified as key topics in newspapers from 1991 to 2018 (a); The proportion of Topics Identified within all articles published with an overall conflictive sentiment (b); The proportion of Topics Identified within all articles published with an overall cooperative sentiment (c).

Figure 6 The Average Sentiment Score of Regional and International Newspapers from 1991 to 2018 (a) Conflict and Cooperation Sentiments perceived within and beyond the Basin (b)

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586 **List of Table Captions**

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588 Table 2 Criteria for inclusion and exclusion of news articles

589

Table 1 The Search Terms Established to Generate Results

Lexis Nexis Requirements	Key Word Search
Must Include the words:	Mekong
Includes at least one of the following words related to water :	water* or river* or lake* or dam* or stream* or tributar* or diversion* or irrigati* or polluti* or "water quality" or flood* or drought* or channel*
Includes at least one of the following words related to conflict/cooperation :	treat* or agree* or negotiat* or resolution* or commission* or secretariat* or "joint management" or "basin management" or "peace accord" or settle* or cooperat* or collaborat* or dispute* or conflict* or disagree* or sanction* or war* or troop* or "letter of protest" or hostil* or "shots fired" or boycott* or protest*
Includes at least one of the following words related to countries involved :	Thai* or Cambodia* or China or Chinese or Lao* or Myanmar* or Burm* or "viet nam" or Vietn*
Does not include any of the following words:	sea, ocean, navigation, nuclear, "water cannon", "light water reactor", "mineral water", "hold water", "cold water", "hot water", "water canister", "water tight", "water down", "flood of refugees", oil, drugs

Table 2 Criteria for inclusion and exclusion of news articles

Criteria for Including Data	Irrigation using the Lancang-Mekong river as a source
	Conflict over water resources: e.g. proposed development
	Cooperation over water resources: e.g. bilateral/multilateral agreements, MRC, ASEAN
	Species affected by development projects: e.g. pollution, water quantity and quality
	Salt intrusion due to decreased water quantity and flow from upstream: e.g. dams/diversions
	Livelihoods affected by use of water resources: e.g. dams, diversions, dam failures, contamination of water
	Flooding or droughts as a result of water release or containment in dams
	Infrastructure development that can affect water resources/species e.g. proposed bridge development, dams, diversions
Criteria for Excluding Data	Tourism not related to the use of water resources by riparian countries: e.g. cruises, blogs, personal recounts
	War: e.g. history of Vietnam War, awarding of medals
	Economic development not related to water resources in Lancang-Mekong River
	Bridges across the Lancang-Mekong River and not referring to effects on water resources
	Tariffs and trade agreements that have no association with water resources
	Border conflicts not pertaining to water resources: e.g. security, border control, land ownership disputes

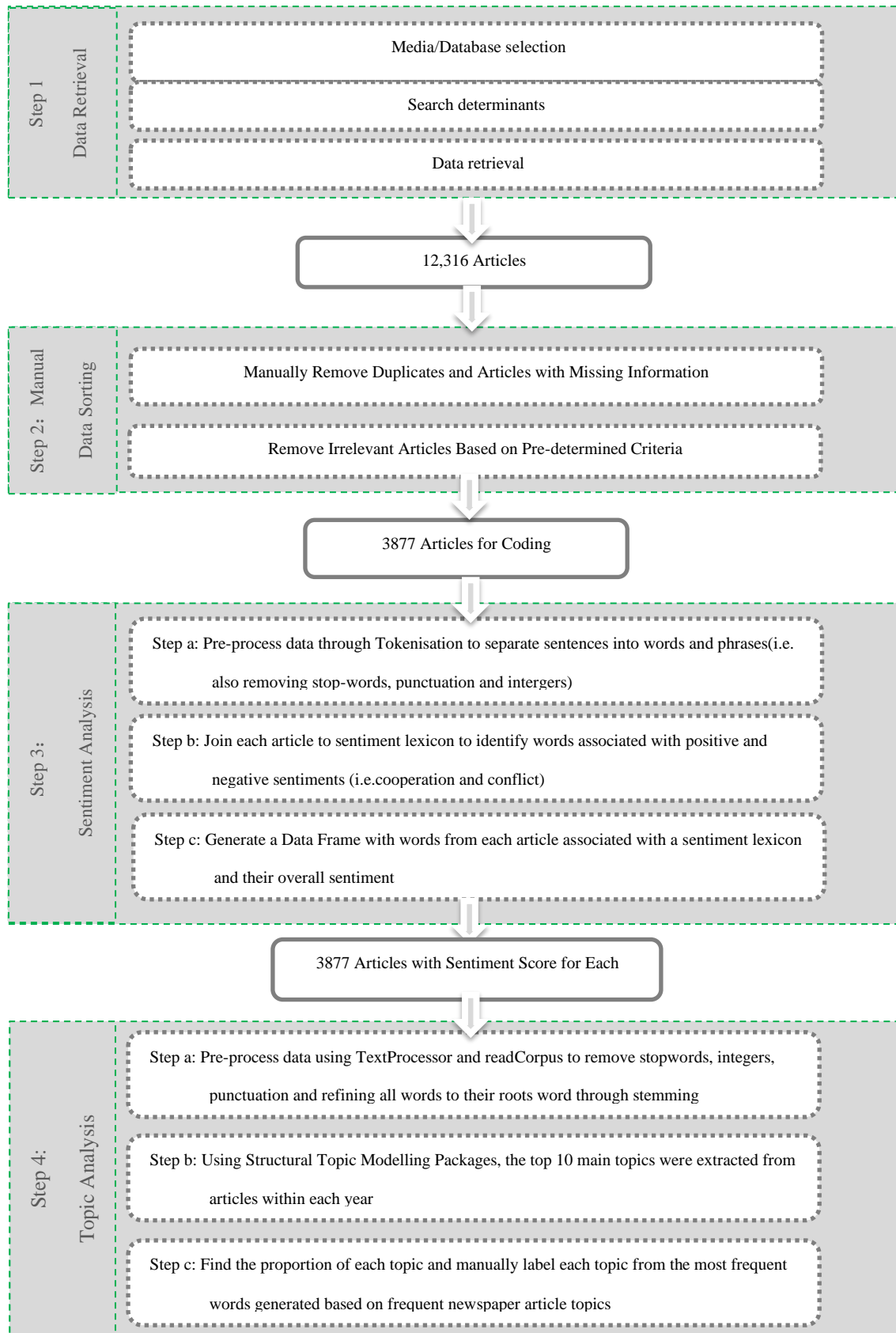
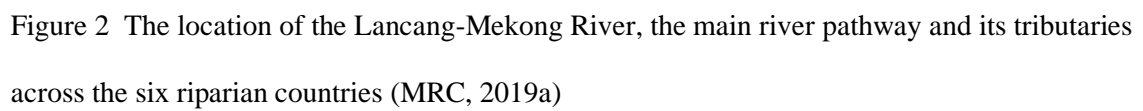
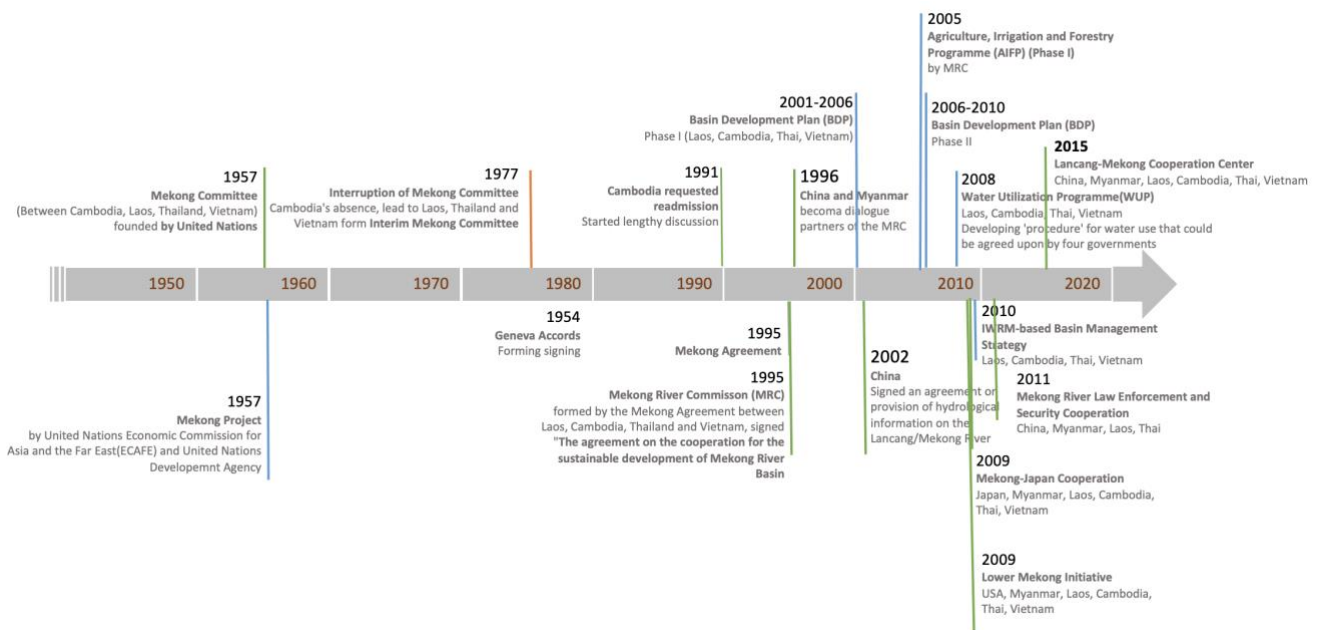


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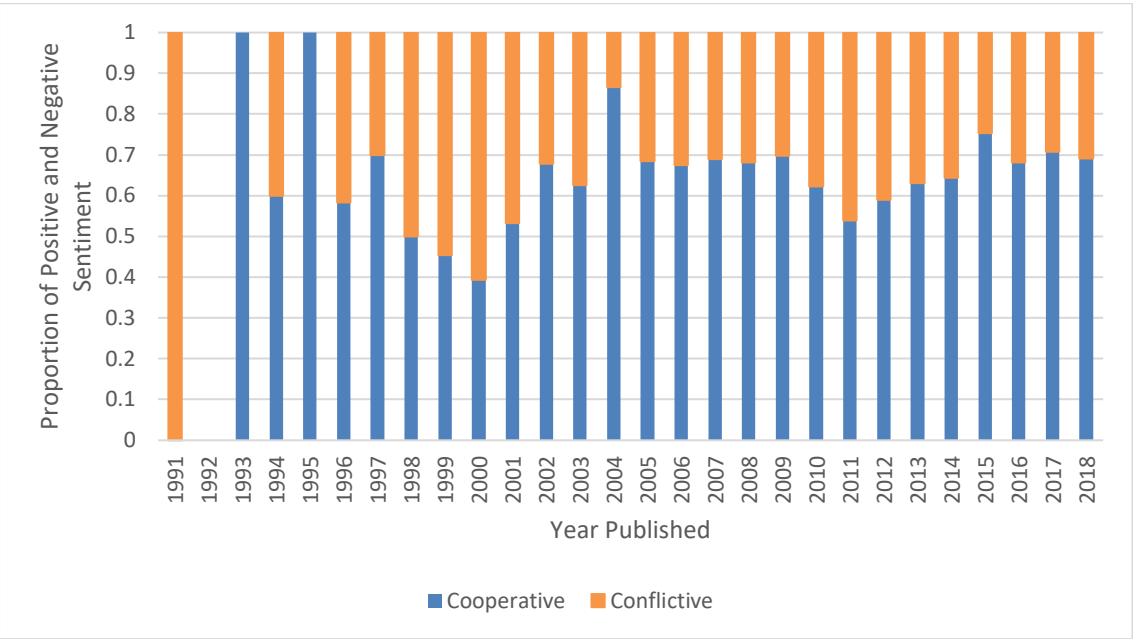




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603 Figure 3 History of Major Events within Lancang-Mekong River Basin (Orange line refers to
 604 interruption of Mekong Committee; Green line refers to policy/strategy/committee/commission
 605 establishment; Blue line refers to projects)

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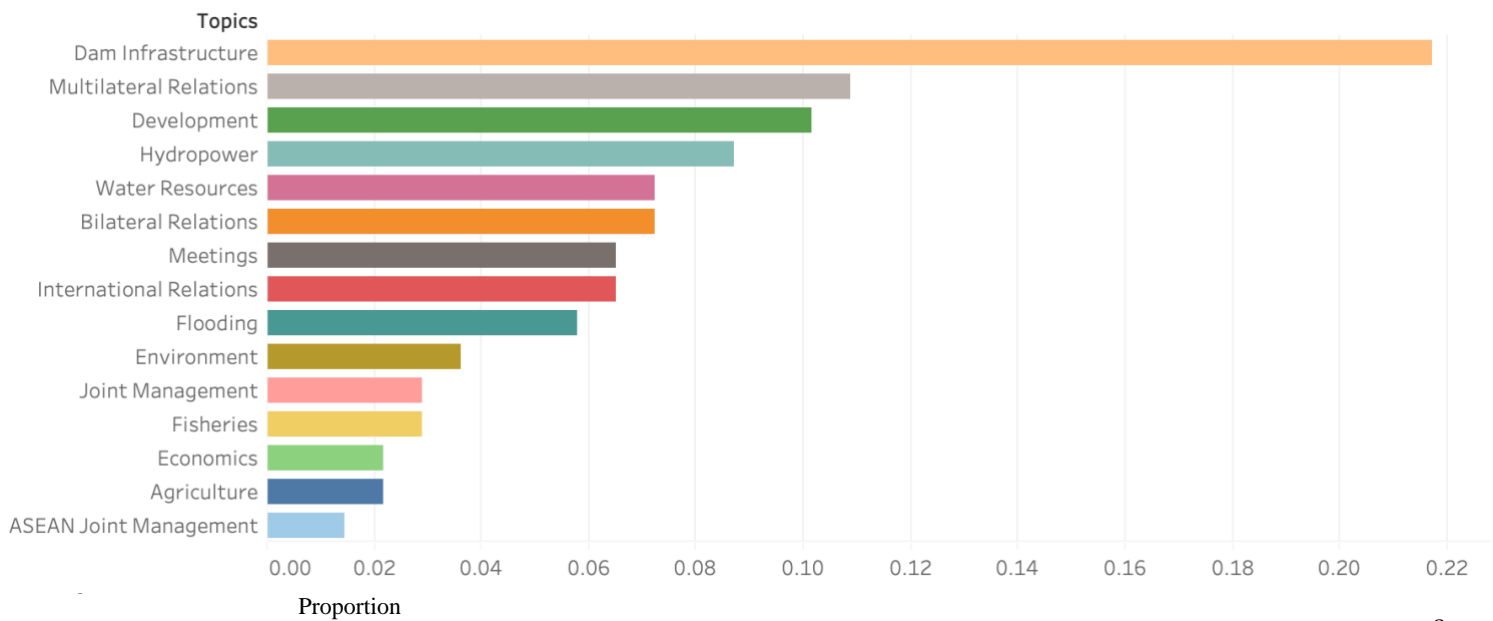


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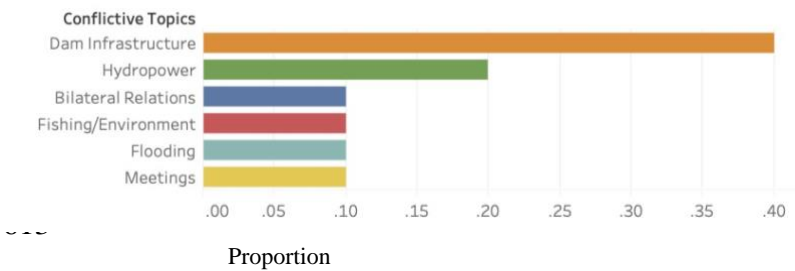
608 Figure 4 Proportion of Cooperation/Conflict articles published pertaining to water events along
609 the Lancang-Mekong River Basin

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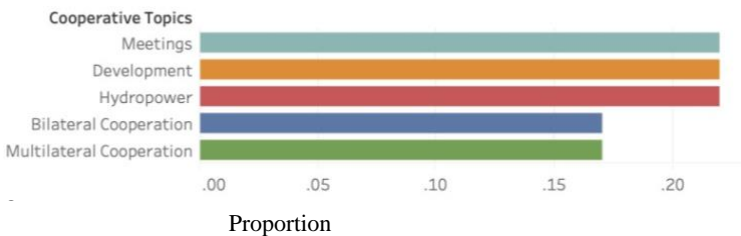
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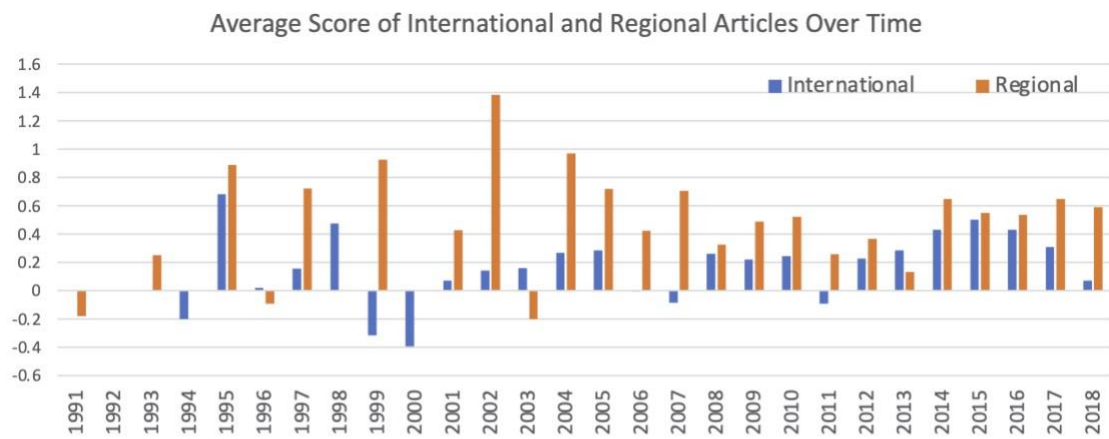
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616 Figure 5 The proportion of all topics identified as key topics in newspapers from 1991 to 2018

617 (a); The proportion of topics identified within all articles published with an overall conflictive

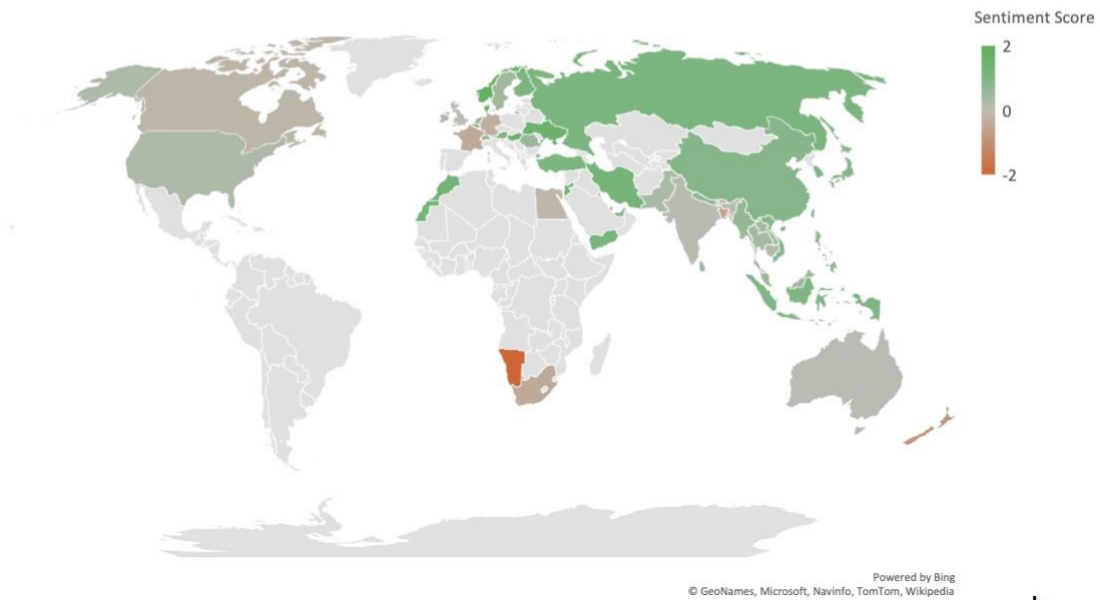
618 sentiment (b); The proportion of topics identified within all article published with an overall

619 cooperative sentiment (c).



a

Conflict and Cooperation Sentiments Perceived within and beyond the Basin

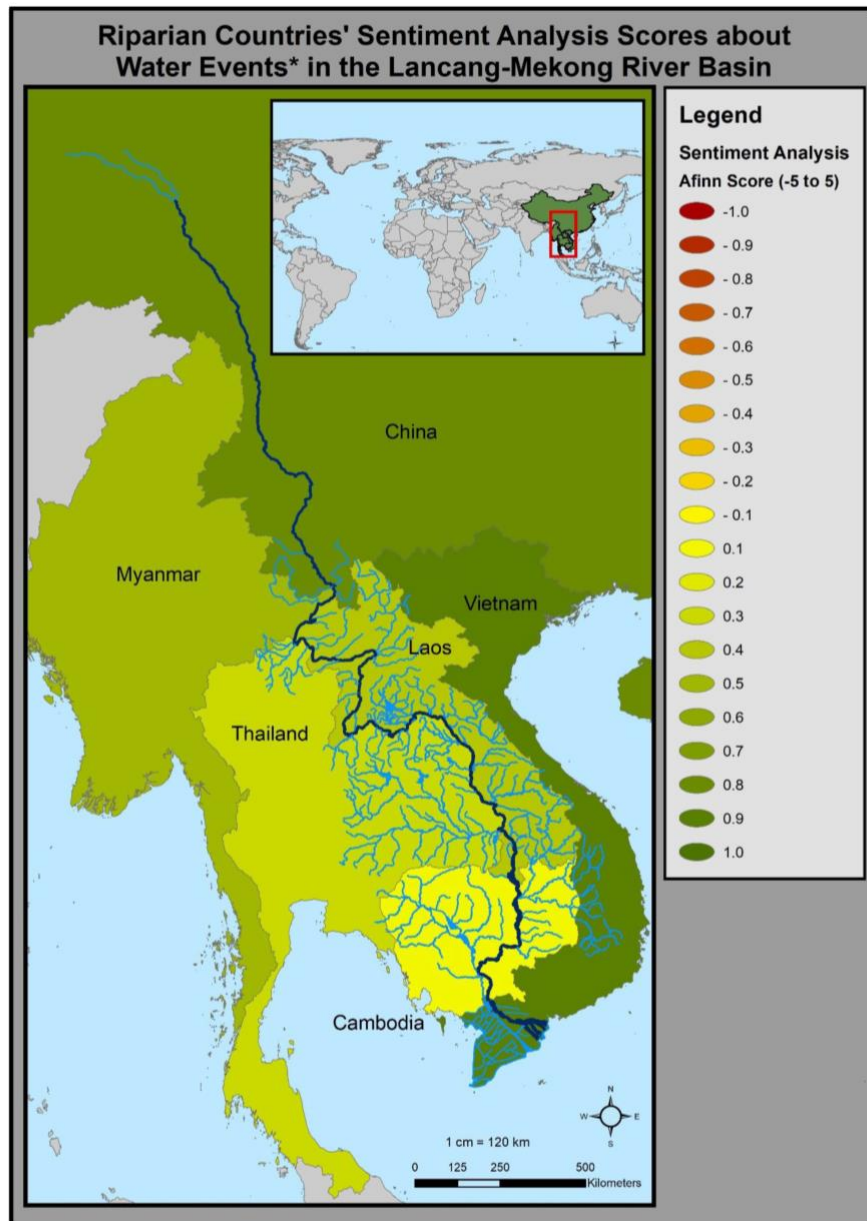


b

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621 Figure 6 The Average Sentiment Score of Regional and International Newspapers from 1991 to

622 2018 (a) Conflict and Cooperation Sentiments perceived within and beyond the Basin (b)

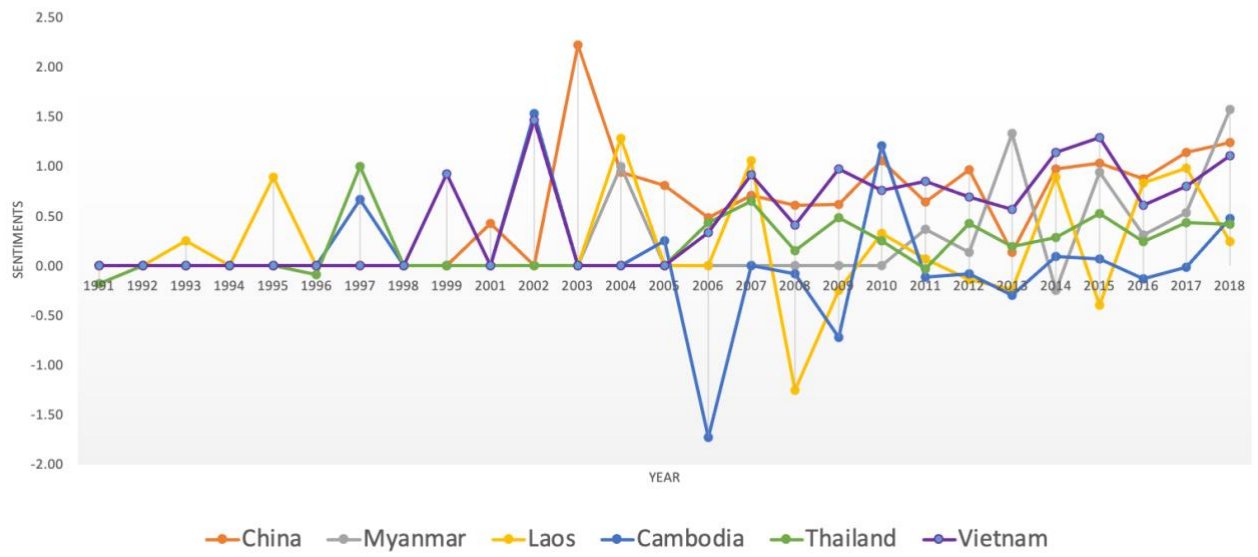


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625 1991 to 2018

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628 Figure 8 Conflict/Cooperative sentiment scores of the riparian countries (Cambodia, China,
629 Laos, Myanmar, Thailand, and Vietnam) from 1991 until 2018