# Extreme rainfall trends over the Mekong Delta under the impacts of climate change

Seung Kyu LEE

Sustainable Management of Natural Resources and Environment Research Group, Faculty of Environment and Labour Safety, Ton Duc Thang University, Vietnam, and

Truong An Dang University of Science-HCMC, Vietnam National University Ho Chi Minh City, Ho Chi Minh City, Vietnam

#### Abstract

**Purpose** – This study aims to investigate aspects related to the changing trends of the rainfall extremes in the entire Mekong Delta in the period of 32 years (1984-2015) applying rainfall extreme indices. First, the homogeneity tests were applied to assess the quality of observed rainfall data series. The authors, then, investigated three rainfall indices including the number of very heavy rainfall days 20 mm (R20), number of days above 50 mm (R50) and number of days above 100 mm (R100) applying the Mann-Kendall test and Sen's slope estimate.

**Design/methodology/approach** – First, the homogeneity tests were applied to assess the quality of observed rainfall data series. The authors, then, investigated three rainfall indices including the number of very heavy rainfall days 20 mm (R20), number of days above 50 mm (R50) and number of days above 100 mm (R100) applying the Mann-Kendall test and Sen's slope estimate.

**Findings** – The results of R20 pointed out that an insignificant upward tendency was found in the coastal provinces, whereas an insignificant downward tendency was also recorded in the inland provinces. Regarding the number of R50, a similar trend to R20 was recorded with five stations slightly increased and five stations slightly decreased. For the number of R100, the results recorded an absence of significant trends over the entire study area. Approximately 58.5% of stations show a slightly decreasing trend, while 41.5% of the remaining stations recorded a slightly increasing trend.

**Originality/value** – For the number of R100, the results recorded an absence of the significant trends over the entire study area. Approximately 58.5% of stations show a slightly decreasing trend, while 41.5% of the remaining stations recorded a slightly increasing trend. Of note is the fact that the number of R100 occurred more frequently in the northern provinces, which means the northern region is facing a high risk of flooding.

Keywords Flooding, Non-parametric test, Rainfall extremes, Rainfall trend, Sen's slope

Paper type Research paper

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The author(s) received no financial support for this research.

This paper forms part of special section "Climate change impacts and adaptations in arid and semi-arid regions", guest edited by Zhihua Zhang, Qiang Zhang and Muhammad Jawed Iqbal.

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Received 12 April 2020 Revised 22 May 2020 1 June 2020 Accepted 2 June 2020



International Journal of Climate Change Strategies and Management Vol. 12 No. 5, 2020 pp. 639-652 Emerald Publishing Limited 1756-8992 DOI 10.1108/IJCCSM-04-2020.0032

#### **IICCSM** 1. Introduction

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In recent decades, climate change has significantly affected most regions of the world and it is considered to be a major topic in the 21st century (Lee and Dang, 2019b; Intergovernmental Panel on Climate Change [IPCC], 2012; Xu et al., 2015). The Intergovernmental Panel on Climate Change IPCC (2012) reported that climate change is one of the major causes of the rise of extreme weather indices in many regions of the world. According to Croitoru *et al.* (2013), the frequency of extreme weather events is rising due to global warming, especially extreme rainfall. They reported that extreme rainfall events (EREs) can cause negative effects on all aspects of life. Therefore, rainfall is one of the meteorological factors that has received the most attention, because EREs can have the negative impacts on several vital sectors of the economy, such as agriculture, infrastructure and transport (Attogouinon et al., 2017; Lee and Dang, 2018; Yazid and Humphries, 2007). In their study on extreme rainfall trends over Utah, Dos Santos et al. (2011) showed that regions and countries that economically depend on agriculture be affected by variations in rainfall. Indeed, studies on extreme rainfall trends are prominent in showing not only their previous evolution but also current and future trends. This can help in formulating strategies to mitigate the impacts of climate change.

Recognizing the importance of EREs for many aspects of life in the context of climate change in recent years, numerous studies have been devoted to trends in EREs on regional, national and global scales (Pingale et al., 2014; Lee and Dang, 2019b; Liu et al., 2015; Soro et al., 2016). Singh et al. (2013) conducted a study on changing trends in extreme seasonal rainfall events over continental America. They concluded that heavier rainfall events in the future will lead to more frequent wet and dry extremes in most regions of the Americas. Mondal and Mujumdar (2015) analysed changes in extreme rainfall characteristics in India, including the intensity, duration and frequency of excess rain over a high threshold. They reported that the varying nature of each extreme rainfall characteristic has led to the necessity of a comprehensive framework for assessing the resulting risks of rainfall-induced flooding. Liu et al. (2015) studied EREs to understand flood risks in detail for the lakarta region of Indonesia. They reported that the return period of the extreme rainfall event on February 2007 in Jakarta was over 300 years for a three-day duration at Halim station. Wu et al. (2016) studied extreme summer rainfall over East Asia. They reported that the EREs showed high complexity from one region to another. Meanwhile, Daksiya et al. (2017) studied annual and seasonal rainfall extremes for a Southeast Asian region under current and future climate conditions. They found significant changes in annual maximum rainfall, with an average increase in daily rainfall as high as 20% in the 100-year return period. Attogouinon et al. (2017) analysed trends in extreme rainfall based on daily rainfall data for the Upper Ouémé valley in Benin over the period 1951–2014 using the non-parametric Mann-Kendall test. Their results revealed that only 30% of the stations experienced decreasing trends for the number of heavy rainfall days and daily maximum rainfall. Lee and Dang (2019) conducted a study on spatio-temporal change trends in rainfall characteristics over the MRD in the recent decades. The results showed that a tendency to decrease in frequency of rainfall is recorded, while a tendency to increase in the spatial distribution is found. Dang (2019) studied maximum rainfall trends in the Long Xuyen Quadrangle Area, Vietnam, over three past decades. The results carried out that approximately of 80 percent of the study area was occurred a slight downward trend of the R20 index. A similar to the R20 index was recorded for the R50 index. According to Adeniran et al. (2010), the growth and development stages of crops mainly depend on rainfall factors. They concluded that too little rainfall will negatively influence agricultural production, while high levels of rainfall also have detrimental effects on crop yields.

The Mekong Delta is one of the largest agricultural production areas in Vietnam and is facing an increasing trend in waterlogging and flooding in recent years due to EREs. According to our understanding, no study on rainfall extremes has been conducted in the Mekong Delta. It is, therefore, necessary to study extreme weather events in potential crop growing areas to provide early warnings and minimise their negative effects. Thus, this research aimed to assess extreme rainfall events in the Mekong Delta Area by applying the Mann-Kendall test and Sen's slope estimator.

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#### 2. Materials and method

#### 2.1 Study area

The Mekong Delta, located at  $8^{\circ}34^{\circ}-11^{\circ}10^{\circ}N$  latitude and  $104^{\circ}25^{\circ}-106^{\circ}48^{\circ}E$  longitude, has a total area of land for agriculture production of approximately 1,690,000 hectares (Figure 1) and a population of approximately 21.49 million people in 2019. It is a coastal delta in the south of Vietnam and belongs to the lower Mekong River (Vu *et al.*, 2018; Lee and Dang, 2019a). The study area is strongly influenced by flows from the upper Mekong River in the flood season and by tide currents that cause saline intrusion from the east and, west seas in the dry season due to low terrain, with elevations ranging from 0.3–2.0 m above mean sea level [Mekong Delta Plan (MDP), 2013; Vu *et al.*, 2018]. Therefore, the Mekong Delta is particularly sensitive and vulnerable to climate change, and the characteristics of rainfall vary across different seasons.

The study area is dominated by a tropical monsoon circulation, with two major monsoon seasons, the northeast and southwest, that alternately blow throughout the year [Food and Agriculture Organization (FAO), 2016; Lee and Dang, 2019a; Mekong Delta Plan (MDP), 2013].

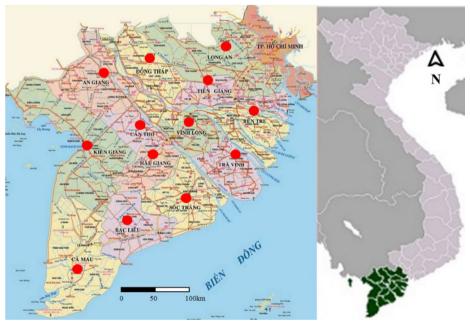


Figure 1. Study area with weather stations marked by the red circles

Source: Lee and Dang (2019a)

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IJCCSM<br/>12,5The southwest monsoon often lasts from May to October, while the northeast monsoon lasts<br/>from November to April [Asia-Pacific Network, 2010; Lee and Dang, 2019a; Mekong Delta Plan<br/>(MDP), 2013]. In the Mekong Delta Area, the rainy season often coincides with the southwest<br/>monsoon and is characterised by being hot, very humid with average annual humidity of<br/>approximately 89%, and, having abundant rainfall, with an intensity of approximately 85% of<br/>annual rainfall (Figure 2). The dry season coincides with the northeast monsoon and is<br/>dominated by dry, and, hot conditions with less rainfall [Asia-Pacific Network, 2010; Food and<br/>Agriculture Organization (FAO), 2016]. The eastern and western coastal provinces have a high<br/>concentration of rainfall, with an annual mean rainfall of approximately 1,800–2,300 mm. The<br/>inland provinces have annual mean rainfall ranging from 1,350 mm to 1,680 mm (Table 1).

#### 2.2 Data description

To perform this research, the daily rainfall data series at 46 rainfall gauge stations belonging to the Mekong Delta Area for the period 1984-2015 were collected from the Southern Regional Hydro-meteorological Centre of Vietnam (SRHCV) to analyze extreme rainfall indices. The gauge stations lack synchronisation due to changing positions, so, we only selected 12-gauge stations that represent 13 provinces belonging to the study area, as shown in Figure 1. To ensure the quality of the collected data series, rainfall data of the 12-gauge stations were obtained based on the sufficient length and width of the observed data series to capture the fluctuations of rainfall. This ensured that the deviation between the gauge stations did not exceed 10%.

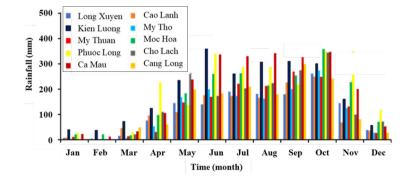
#### 2.3 Extreme rainfall indices

The World Meteorological Organization (WMO) recommends several ERIs for investigating changing trends in the spatial and temporal distributions at country, regional and world scales. The ERIs summarised in Table 2 have been widely applied (Attogouinon *et al.*, 2017; Soro *et al.*, 2016; Xu *et al.*, 2015).

Rainfall indices namely the number of very heavy rainfall days 20 mm (R20), number of days above 50 mm (R50) and number of days above 100 mm (R100)) were adopted based on the preliminary analysis of the rainfall characteristics.

#### 2.4 Detecting extreme rainfall trends

Numerous statistical methods, such as parametric and non-parametric tests have been used to detect monotonic trends in hydro-meteorology and environment problems (Attogouinon *et al.*, 2017; Lee and Dang, 2019a; Xu *et al.*, 2015). The Mann-Kendall test and Sen's slope estimator



**Figure 2.** Monthly mean rainfall at gauge

1984-2015

stations for the period

have been widely applied to determinate tendencies in rainfall characteristics (Attogouinon et al., 2017; Lee and Dang, 2019c; Jain and Kumar, 2012). One benefit of these tests is that they are non-parametric, very simple, do not require the assumption of normality, are robust against outliers and can handle missing values (Chandler and Scott, 2011; Moulai et al., 2013). Another advantage of applying the Mann-Kendall test is that it has low sensitivity to abrupt breaks due to inhomogeneous data series (Xu et al., 2015; Wani et al., 2013). The Mann-Kendall test is considered perfect if various points are tested in a single data series.

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The Mann-Kendall test is defined by equation (1):

$$S = \sum_{i=1}^{n-1} \sum_{j=i+1}^{n} \text{Sgn} (X_j - X_i)$$
(1)

With  $Sgn(\ldots)$  is given by equation (2):

| No.   | Station  | AMR (mm)                                     | SD (mm)  | Longitude (E)  | Latitude (N)   | Periods  |   |
|---|--|--|--|--|--|--|---|
| $     \begin{array}{c}       1 \\       2 \\       3 \\       4 \\       5 \\       6     \end{array} $ | Long Xuyen<br>My Tho<br>Cao Lanh<br>My Thuan<br>Phuoc Long<br>Kien Luong | 1362<br>1379<br>1365<br>1483<br>1884<br>2087 | 81.77<br>83.49<br>77.79<br>90.15<br>109.99<br>118.67 | 105°25'13<br>106°20'37<br>105°38'02<br>105°56'37<br>105°45'22<br>104°38'07 | 10°22'21<br>10°22'35<br>10°27'17<br>10°14'49<br>09°34'40<br>10°18'15 | 1978–2015<br>1978–2015<br>1984–2015<br>1978–2017<br>1978–2015<br>1974–2018 | Table 1.  |
| 7<br>8<br>9<br>10   | Ca Mau<br>Cang Long<br>Cho Lach<br>Moc Hoa                               | 2328<br>1535<br>1537<br>1633                 | 132.68<br>89.75<br>109.08<br>104.79                  | 105°07'35<br>106°13'42<br>106°10'11<br>105°57'12                           | 09°10'15<br>09°58'02<br>10°14'27<br>10°44'51                         | 1975–2018<br>1980–2015<br>1979–2017<br>1978–2016                           | Annual mean rainfall<br>(AMR) and standard<br>deviation (SD) at<br>gauge stations |

| Index   | Indicator name   | Definitions  | Units        |   |
|---|--|--|--------------|---|
| SDII  | Simple daily intensity indices                                 | Annual total rainfall divided by the number of wet days (defined as PRCP > D 1.0 mm) in the year                 | mm day-1     |   |
| R10<br>R20  | Number of heavy rainfall days<br>Number of very heavy rainfall | Annual count of days when $PRCP \ge D \ 10 \text{ mm}$<br>Annual count of days when $PRCP \ge D \ 20 \text{ mm}$ | days<br>days |   |
| R25   | days<br>Number of days   | Annual count of days when $\mbox{PRCP} \geq D25\mbox{mm}$  | days         |   |
| CDD   | above mm<br>Consecutive dry days                               | Maximum number of consecutive days with $RR \leq 1mm$  | days         |   |
| CWD   | Consecutive wet days   | Maximum number of consecutive days with $RR \ge D$<br>1 mm   | days         | T-11-0  |
| R95p<br>R99p  | Very wet days<br>Extremely wet days                            | Annual total PRCP when RR > 95th percentile<br>Annual total PRCP when RR > 99th percentile                       | mm<br>mm     | Table 2.           List of extreme           rainfall indices |
| <b>Note:</b> PRCP is the daily precipitation amount; RR is the daily precipitation amount on day <b>Source:</b> Xu <i>et al.</i> (2015) |  |  |              | established by the<br>WMO                                     |

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Sgn 
$$(X_j - X_i) = \begin{cases} +1 \ if \ x_j - x_i > 0 \\ 0 \ if \ x_j - x_i = 0 \\ -1 \ if \ x_j - x_i < 0 \end{cases}$$
 (2)

where  $X_j$  and  $X_i$  are the annual data series; j and i have the condition of j > i.where if  $n \ge 10$ , the statistic sign S is considered a standard distribution, with the average value (E) being defined by equation (3):

$$\mathbf{E}[\mathbf{S}] = \mathbf{0} \tag{3}$$

and variance (Var) is given as in equation (4):

$$\operatorname{Var}(S) = \frac{1}{18} \left[ n(n-1)(2n+5) - \sum_{j=1}^{m} t_j(t_j-1)(2t_j+5) \right]$$
(4)

where m is the number of the tied groups in the data series; t<sub>i</sub> is the number of ties to extent j.

The summation term in the numerator is used if the data series contain tied values. For the sample size n > 10, the corresponding values of S and Var(S) are calculated by the statistics of the standard test ( $Z_s$ ).where  $Z_s$  is calculated by equation (5):

$$Z_{\rm S} = \begin{cases} \frac{{\rm S}-1}{\sqrt{{\rm Var}({\rm S})}} & \text{if } S > 0\\ 0 & \text{if } S = 0\\ \frac{{\rm S}-1}{\sqrt{{\rm Var}({\rm S})}} & \text{if } S < 0 \end{cases}$$
(5)

where S in equation (5) is defined by equation (6):

$$\tau = \frac{S}{D} \tag{6}$$

while D in equation (6) is calculated by equation (7):

$$D = \left[\frac{1}{2}n(n-1) - \frac{1}{2}\sum_{j=1}^{m} t_j(t_j-1)\right]^{\frac{1}{2}} \left[\frac{1}{2}n(n-1)\right]^{\frac{1}{2}}$$
(7)

The statistical  $Z_s$  test is often used to assess the importance of trends. Accordingly, if  $Z_s$  in equation (5) is positive,  $Z_S$  presents an upward trend while a negative presents a downward trend of the considered factor (Attogouinon *et al.*, 2017; Joshi and Pandey, 2011). At significance level  $\alpha$ ,  $Z_S \ge Z_{\alpha/2}$ , so the  $\alpha$  trend of the data series, is considered to be significant.

To detect the monotonic trends of ERIs over the study area, three ERIs were assessed using the Mann-Kendall test and Sen's slope estimator with a significance level of 5.0%. If the *p*-value is lower than this threshold level, *H0* is rejected. By rejecting the null

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IJCCSM 12,5 assumption, the results record an upward or/downward trend if the  $Z_s$  value is positive or negative, respectively (Attogouinon *et al.*, 2017; Su *et al.*, 2006).

After monotonic trend is defined by the Mann-Kendall test, its magnitude is defined by Sen's slope estimator. Sen's slope is defined as follows:

$$\beta = \text{Median}\left(\frac{X_i - X_j}{i - j}\right) \text{ with } j < i$$
 (8)

where  $X_i$ ,  $X_i$  are data series at time scales  $t_i$  and  $t_i$ , respectively.

In this study, the Mann-Kendall test and Sen's slope estimator were used to detect the spatial and temporal variation of ERIs in the study area, with a significance level of 95%. At a significance level of 5.0%, the null hypothesis of no trend is rejected if  $|Z_S| > 1.96$ .

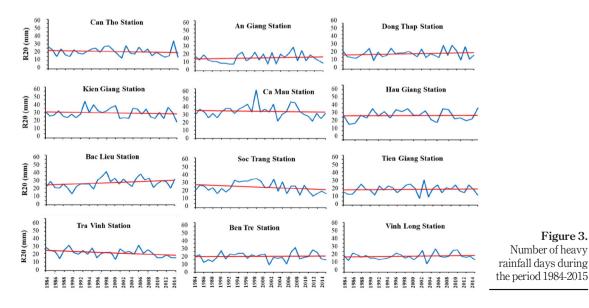
Analysis of the ERIs' trends using the Mann-Kendall test and Sen's slope estimator, with a significance level of 95% was carried out to identify the possible temporal changes in rainfall frequency across the entire study area during the period 1984-2015.

#### 3. Results and discussion

#### 3.1 Temporal features of extreme rainfall indices

For the R20 index, 8 out of 12 stations recorded a downward trend (Figure 3). Specifically, slight downward trends were observed at western coastal stations, such as Kien Giang, Ca Mau, Hau Giang, Tien Giang and Can Tho, with  $Z_s$  values varying from -0.45 to -0.73; at the eastern coastal station, namely, Soc Trang ( $Z_s = -1.49$ ); and at inland stations such as Vinh Long ( $Z_s = -0.24$ ). A significant downward trend was recorded at Tra Vinh station ( $Z_s = -2.24$ ) (Table 3). In contrast, a slight upward trend was recorded at stations such as An Giang, Dong Thap and Bac Lieu, with  $Z_s$  values ranging from 0.37 to 1.71 (Table 3).

Regarding the R50 index, with the exception of Soc Trang station, which detected no upward or downward trend, the entire study area recorded no significant changes in



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tendency, while a slight upward trend was recorded at six out of 12 stations, including Ca Mau, Tra Vinh, Hau Giang, Vinh Long, Tien Giang and Dong Thap, with  $Z_{\rm s}$  values from 0.11 to 1.56 (Table 4). In contrast, a slight downward trend was found at stations such as Kien Giang, Bac Lieu, Ben Tre, Can Tho and An Giang, with  $Z_{\rm s}$  values ranging from –0.23 to –1.46 (Table 4).

Similarly, the analysed results for the R100 index are shown in Figure 5 and Table 5. Accordingly, a slight downward trend was recorded at western coastal stations such as Kien Giang and Ca Mau, with  $Z_s$  values varying from -0.41 to -0.82; at eastern coastal stations such as Tra Vinh and Ben Tre ( $Z_s = -0.58 \div -0.88$ ); and at inland stations, namely, Can Tho, Hau Giang and Long An, with  $Z_s$  values ranging from -0.41 to -1.07 (Table 5). In contrast, a slight upward trend was recorded at Dong Thap, Vinh Long, Bac Lieu and Soc Trang

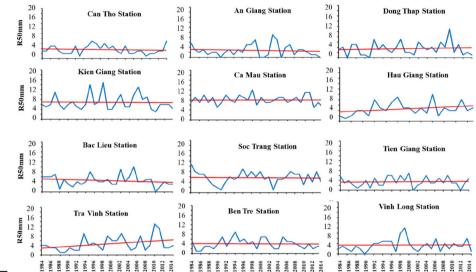


Figure 4. Number of very heavy rainfall days during the period 1984-2015

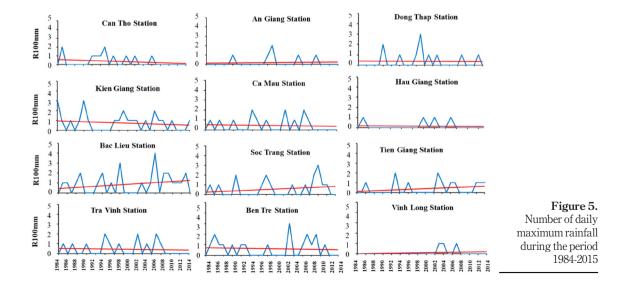
|  | Station  | Z <sub>S</sub>  | <i>p</i> -value   | β  |
|--|--|---|---|--|
| <b>Table 3.</b><br>Statistical tests of<br>heavy rainfall days<br>during the period<br>1984–2015 | Kien Giang<br>Ca Mau<br>Bac Lieu<br>Soc Trang<br>Tra Vinh<br>Ben Tre<br>Can Tho<br>Hau Giang<br>Vinh Long<br>Tien Giang<br>Dong Thap<br>An Giang | $\begin{array}{c} -0.73 \\ -0.49 \\ 1.71 \\ -1.49 \\ -2.24 \\ 0.00 \\ -0.63 \\ -0.51 \\ -0.24 \\ -0.45 \\ 0.58 \\ 0.37 \end{array}$ | $\begin{array}{c} 0.23\\ 0.31\\ 0.04\\ 0.06\\ 0.01\\ 0.50\\ 0.10\\ 0.30\\ 0.40\\ 0.32\\ 0.27\\ 0.35\end{array}$ | $\begin{array}{c} -0.33 \\ -0.28 \\ 0.00 \\ -0.50 \\ -0.40 \\ -0.20 \\ -0.33 \\ -0.37 \\ -0.08 \\ -0.16 \\ -0.15 \\ -0.18 \end{array}$ |

stations ( $Z_s$  varying from 0.02 to 1.35). In particular, a significant upward trend was recorded at Tien Giang station (Zs = 1.97), implying that the Tien Giang province faces a high risk of flooding problems compared to other regions.

#### 3.2 Spatial features of extreme rainfall indices

The analysed results of the spatial pattern of ERIs across the study area in the period 1984-2015 are presented in Figures 6, 7 and 8. Figures 6–8 present the different symbols corresponding to the upward trend, no trend and the downward trend of the R20, R50 and R100, respectively, while different colour scales show the number of rainfall days of the R20, R50 and R100. The results show that the number of R20 days varied from 12 to 32 days per year (Figure 6). The highest number of R20 days, up to 30 days per year,

| Station    | Z <sub>S</sub> | <i>p</i> -value | β     |
|------------|----------------|-----------------|-------|
| Kien Giang | -0.41          | 0.34            | -0.09 |
| Ca Mau     | 0.11           | 0.45            | -0.07 |
| Bac Lieu   | -1.46          | 0.07            | -0.11 |
| Soc Trang  | 0.00           | 0.50            | -0.10 |
| Tra Vinh   | 1.56           | 0.05            | 0.00  |
| Ben Tre    | -0.23          | 0.40            | -0.08 |
| Can Tho    | -0.84          | 0.19            | -0.09 |
| Hau Giang  | 0.44           | 0.32            | -0.07 |
| Vinh Long  | 0.32           | 0.37            | -0.06 |
| Tien Giang | 0.41           | 0.33            | -0.04 |
| Dong Thap  | 0.11           | 0.45            | -0.07 |
| An Giang   | -1.00          | 0.15            | -0.11 |

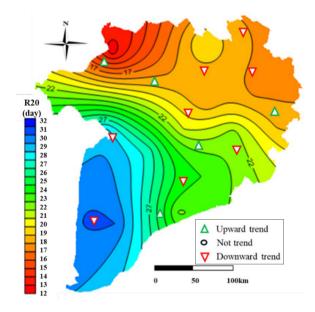


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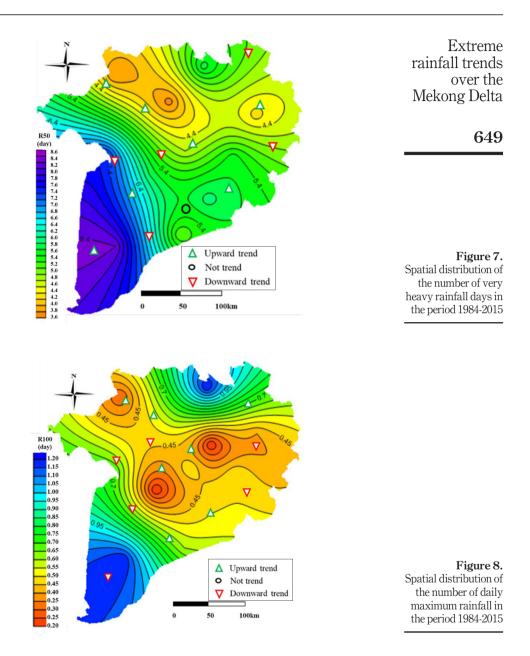
Table 4. Statistical tests of very heavy rainfall days during the period 1984-2015

| IJCCSM<br>12,5       | Station    | Z <sub>S</sub> | <i>p</i> -value | β     |
|----------------------|------------|----------------|-----------------|-------|
| ;-                   | Kien Giang | -0.41          | 0.34            | -0.05 |
|                      | Ca Mau     | -0.82          | 0.20            | -0.08 |
|                      | Bac Lieu   | 1.35           | 0.08            | 0.04  |
|                      | Soc Trang  | 1.13           | 0.12            | 0.03  |
| 0.40                 | Tra Vinh   | -0.58          | 0.27            | 0.00  |
| 648                  | Ben Tre    | -0.88          | 0.18            | -0.08 |
|                      | Can Tho    | -1.07          | 0.14            | -0.09 |
| T-11- F              | Hau Giang  | -0.51          | 0.30            | -0.37 |
| Table 5.             | Vinh Long  | 1.16           | 0.12            | 0.03  |
| Statistical tests of | Tien Giang | 1.97           | 0.04            | 0.13  |
| daily maximum        | Dong Thap  | 0.02           | 0.49            | 0.00  |
| rainfall during the  | Long An    | -0.53          | 0.29            | -0.01 |
| period 1984-2015     | An Giang   | 0.41           | 0.33            | 0.00  |



**Figure 6.** Spatial distribution of the number of heavy rainfall days in the period 1984-2015

occurred in the western coastal regions (Kien Giang, Hau Giang and Ca Mau provinces). In contrast, the lowest number of the R20 index, 13 days per year, was recorded in the northern coastal regions, with a mean value approximately of 14 days per year. Specifically, for the spatial distribution of the R20 index, a shift and a slight upward trend were observed at the northern stations such as An Giang, Dong Thap, Tien Giang, Vinh Long and Bac Lieu, while a slight downward trend was recorded in all other regions. The statistical results also indicate that the number of R20 days decreased from the southern regions to the northern regions (Figure 6). In the study period (1984-2015), the highest number of 32 R20 days per year was observed at Ca Mau station, meaning that this region has a higher risk of heavy rainfall problems, leading to the inundation of planting crops.



Similarly, the spatial distribution of the R50 index is presented in Figure 7. The mean annual value of R50 over the entire study area was around six days per year. The highest values were recorded at the western coastal provinces such as Ca Mau, Kien Giang and Bac Lieu (7.2–8.6 days per year) and the lowest values occurred in the northern region (An Giang, Dong Thap Provinces) and eastern coastal region (Tien Giang and Long An Provinces),

varying between 3.6 and 4.6 days per year. From these results, it is possible to conclude that the flooding risk due to rainfall with high intensity in the southern coastal provinces is greater than in other regions.

Finally, the spatial distribution of the R100 index is displayed in Figure 8. The daily maximum rainfall in the period 1984-2015 fluctuated from 0.2 to 1.2 days per year; high values for R100 were recorded at Long An and Ca Mau provinces (up to 0.95 days per year), while low values of R100 were observed in most of the remaining regions.

Generally, the spatial distribution of the R100 index tends to shift from the eastern and western coastal provinces to inland provinces such as Long An and Dong Thap (Figure 8). It can be inferred that northwest provinces are facing a very high risk of maximum rainfall leading to heavy waterlogging and flooding compared to other regions.

#### 4. Conclusion

This study analysed changing trends in ERIs using the Mann-Kendall test and Sen's slope estimator across the Mekong Delta, based on daily rainfall data series in the period 1984-2015. Regarding the R20 index, except for Tra Vinh station which recorded a significant downward trend, and Ben Tre station which did not record any upward or downward trend, eight out of the 12 stations belonging to the western and eastern coastal provinces recorded slight downward trends, while slight upward trends were observed at inland stations. Regarding spatial distribution, a slight shift of the R20 index was recorded from the southern to the northern provinces.

The absence of significant changes in the R50 index at Soc Trang station means no specific trends were detected. Slight upward/downward tendencies similar to the R20 index were observed for the R50 index, with six out of 12 stations recording slight upward trends and five out of 12 stations recording slight downward trends. The western coastal region, including Ca Mau, Kien Giang and, Bac Lieu provinces showed a high concentration of very heavy rainfall days.

Regarding the R100 index, a slight upward trend was observed at the eastern and, western coastal stations and at inland stations, while a slight upward trend occurred at Dong Thap, Vinh Long, Bac Lieu, Soc Trang stations. Notably, Tien Giang station recorded a significant upward trend in the R100 index, implying that a high risk of waterlogging threatens this region.

Overall, this study can improve the understanding of recent changes in the intensity and frequency of ERIs over the entire study area. The results of this study are extremely useful for supporting agricultural production and, aquaculture seafood and for minimising the damage caused by ERIs.

The results are also worth noting for the absence of a significant upward trend in the ERIs, which can be beneficial for agricultural production and aquaculture. However, in the long term, this will negatively impact the rainfall accumulation needed to provide irrigation water for planting crops in the dry season.

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#### **Corresponding author**

Lee Seung Kyu can be contacted at leeseungkyu@tdtu.edu.vn

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