

Article Interdecadal Variation of Summer Extreme Heat Events in the Beijing–Tianjin–Hebei Region

Yanan Liang¹, Junzhi Zhang^{1,*}, Ji Wang^{2,*} and Tiejun Xie²

- Beijing Climate Change Response Research and Education Center, Beijing University of Civil Engineering and Architecture, Beijing 100044, China; 2108570020015@stu.bucea.edu.cn
- ² Beijing Regional Climate Center, Beijing 100089, China; xietj@bj.cma.gov.cn
- * Correspondence: zhangjunzhi@bucea.edu.cn (J.Z.); wangji_zl@163.com (J.W.)

Abstract: Extreme heat events are frequent in the Beijing-Tianjin-Hebei (BTH) region due to global warming and accelerated urbanization. While previous studies have analyzed the trend of extreme heat events in the Beijing-Tianjin-Hebei (BTH) region, the interdecadal changes of these events remain unclear. Therefore, this study aims to analyze the interdecadal temporal and spatial characteristics of summer extreme heat events in the BTH region using daily mean and maximum temperature datasets from 174 stations over the period 1979–2020. The results are shown as follows: (1) From 1979 to 2020, extreme heat events showed an overall upward trend in the BTH region. There were similarities in the changes in the extreme maximum temperature (TXx) and the number of high-temperature days (Htd) between different generations, and both were low until the mid-1990s. (2) In terms of the spatial pattern, TXx and Htd both showed the spatial distribution characteristics of being high in the south and low in the north. Extreme heat events in the BTH region were mainly concentrated in Beijing City, Tianjin City, and the eastern region of Hebei, and the TXx increase in most areas reached 1.5–2.0 °C. (3) The number of high-temperature days (Htd) increased significantly in the background of global warming, especially in Beijing, Tianjin, and Shijiazhuang Cities. (4) Extreme heat events in the BTH region mainly occurred in June and July, and the interdecadal changes showed a decreasing trend in June and an increasing trend in July. A high proportion of Htd was concentrated in Northern Hebei Province in July.

Keywords: extreme heat events; summer; interdecadal; spatiotemporal variations; Beijing–Tianjin– Hebei region

1. Introduction

Regional climate responses to global warming, including changes in temperature extremes, have received extensive attention in recent decades [1]. Increased warming leads not only to an increase in annual mean temperature, but also to an increase in the frequency and intensity of extreme weather events, and changes in mean temperature are likely to trigger a series of extreme temperature events [2,3]. With the global mean temperature rapidly rising in recent decades, increases in the frequency, intensity, duration, and spatial extent of extreme heat events have been evident and significant in countries such as the United States, South Korea, and China [4–6]. These changes in extreme heat events can easily cause the formation of mighty heatwaves that can induce severe meteorological disasters and bring huge damage to the ecosystem and the human society [6-8]. There is a warm-dry climate tendency over most parts of Northern China, and increased heatwaverelated disasters have been observed during recent decades [9]. For example, in the summer of 2018, a heatwave event with a record-breaking duration and intensity occurred in North China and Northeast China, which induced huge economic losses [10,11]. The threat of extreme heat events is increasing. Therefore, it is very important and urgent to understand the spatiotemporal characteristics and occurrence mechanisms of extreme heat events.



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China is a sensitive and significant area of global climate change. In the past 100 years, the warming rate of China has been significantly higher than the global mean level for the same period [12]. At the same time, the trend of climate warming is accelerating [13]. The intensity and frequency of extreme weather and climate events in China have increased significantly over the past 50 years [14]. Domestic and foreign scholars have conducted much research on extreme heat events in different regions of China, and they have obtained relatively consistent results. For example, Guo et al. [15] studied the spatiotemporal variation trends of seven extreme temperature indices in Northeast China, and they found that against the background of an average temperature increase of about 1.56 °C in Northeast China, the extreme temperature indices had a significant upward trend, and most regions became warmer and drier, which had a certain impact on regional climate change. In 2018, Northeast China suffered from an unusual summer extreme heat event with the maximum air temperature anomaly exceeding 6 °C [16]. Ma et al. [17] studied the extreme temperatures in Northern China and pointed out that the change in extreme temperatures is closely related to regional warming; they concluded that since the 1990s, the frequency of the highest temperature in most parts of Northern China has increased significantly. Ma et al. [18] discussed and studied the detailed characteristics of the future changes in summer heat waves over three major urban agglomerations (Beijing-Tianjin-Hebei (BTH) region; the Yangtze River Delta (YRD); the Pearl River Delta (PRD)) in Eastern China under the 1.5 and 2.0 °C warming scenarios, and they found that the predicted change in the heat wave index in urban areas is much higher than that in non-urban areas, which means that urban areas will face higher heat-related disease or environmental risks than suburban or rural areas in the future. In addition, studies on the spatiotemporal characteristics of extreme heat events in the Yellow River Basin [19], the Huaihai Basin [20], the Qinghai–Tibet Plateau [21], and other regions showed that the change in extreme temperature will lead to regional climate change and be affected by many factors.

Compared with in other regions in China, the heating rate in North China is higher than the national level, and it is one of the most severely affected areas with frequent extreme heat events in summer [22]. The Beijing-Tianjin-Hebei (BTH) region in North China is a typical rapidly urbanized region, with rapid urban expansion and great impact from human activities [23,24]. Due to its special geographical location, the BTH region is increasingly socially and economically affected by extreme heat events [25,26]. The occurrence of extreme heat events is affected by many factors, and the variation results are different in different research periods. Atmospheric circulation is usually considered as the direct cause of extreme heat events [27]. For Beijing, extreme heat events are caused by abnormal south and north winds, resulting in an increase or decrease in the humidity in Beijing [28]. Zheng et al. [29] pointed out that the extreme heat events in the three major cities of Beijing, Tianjin, and Shijiazhuang showed a significant upward trend in the interannual changes and climate warming and the heat island effect are the most important factors enhancing the change in extreme heat events. Wang et al. [26] conducted a study on extreme heat events in the BTH region in the context of climate change. They concluded that extreme heat events in the region are on the rise, with the largest change range in extreme heat event indices observed in the central areas of Beijing, Tianjin, and Shijiazhuang. Their research provides scientific evidence for understanding extreme events in the BTH region and highlights the increasing threat that extreme heat events pose to the region's development. Building upon the work of Wang et al. [26], our study aims to investigate the interdecadal spatiotemporal evolution characteristics of extreme heat events in the BTH region and develop adaptation strategies for extreme climate events.

The aim of this study was to examine the temporal trend and the spatial heterogeneity of extreme heat events during summers in the BTH region, utilizing both up-to-date and long-term observational data. Drawing on previous research on the duration of heat waves in the region, we investigated whether the intensity and frequency of extreme heat events underwent greater changes in certain decades. Therefore, in our study, the daily maximum temperatures at 174 meteorological stations from 1979 to 2020, along with the extreme maximum temperatures (TXx) and the number of high-temperature days (Htd), were selected as the typical indicators of extreme heat events. The temporal and spatial variation patterns of summer extreme heat events in the BTH region in these recent 42 years were analyzed on the monthly and annual scales. Then, we explored the space–time evolution characteristics of the two indicators between different ages. This study is of great significance for revealing the changes in extreme high-temperature events in time and space and their regional response to global warming.

2. Data and Methods

2.1. Study Area and Data Source

Our analysis was based on the daily temperature data from 174 meteorological stations in the Beijing–Tianjin–Hebei (BTH) region for 42 summers (June, July, and August) from 1979 to 2020. The original temperature data for each station were obtained from the National Meteorological Information Center of the China Meteorological Administration (http://data.cma.cn/, accessed on 5 May 2022), and the quality of the data was strictly controlled. None of these stations missed more than 5% of measurements during the study period. Among the 174 stations, there were 20 stations in Beijing City, 12 stations in Tianjin City, and 142 stations in Hebei Province. The BTH region presents topographic characteristics of the high northwest and the low southeast regions, and the height of the station increases from south to north. According to historical data, topographic features, and geographical distribution maps, the BTH region was divided into six regions: Beijing City, Tianjin City, Northern Hebei (Zhangjiakou and Chengde), Eastern Hebei (Qinhuangdao and Tangshan), Central Hebei (Shijiazhuang, Hengshui, Baoding, Cangzhou, and Langfang), and Southern Hebei (Xingtai and Handan). The locations of these stations and the topography of the BTH region are shown in Figure 1.



Figure 1. The spatial distribution of meteorological stations over the BTH region.

2.2. Indices of Temperature Extremes

We used two of the extreme temperature indices from the ETCCDI of the World Meteorological Organization's (WMO) Climate Panel (CCI) [30]: the extreme daily maximum temperature (TXx) and the number of high-temperature days (Htd). These two indices have been widely used in analyzing the changes in extreme heat events over different regions, including the BTH region [31]. In this study, TXx was defined as the largest daily maximum temperature in a year, and Htd was defined as the number of days in a year with a daily maximum temperature of \geq 35 °C (Table 1). The probability distribution function curve yields that the daily maximum temperature of 35 °C in summer over the BTH region in the last 42 years corresponds to 95.34 percentile values, so it is reasonable to use 35 °C to define Htd (the figure was omitted). These two indices were used to represent the intensity and the frequency of extreme heat events, respectively.

Table 1. Indices of extreme heat events.

Indices	Abbreviation	Definition	
Extreme maximum temperature	TXx (°C)	The maximum value of daily maximum temperature in a year	
The number of high-temperature days	Htd (d)	The number of days with a daily maxim temperature of ≥35 °C in a year	

2.3. Methods

We used a linear regression method to analyze the trends in extreme heat events, and we used the Mann–Kendall test to identify whether there were transitions in changes in TXx over the BTH region. As shown in Figure 2, the results of the Mann–Kendall test indicated a transition in the mid-1990s (UB and UF are parameters of the M–K test). Therefore, we separated the study period into two periods to further study the interdecadal variation of extreme heat events over the BTH region: P1 was for the period from 1979 to 1994, and P2 was for 1997 to 2020. In addition, the linregress function in Python was used to test the significance of the linear trend of extreme heat events at each station over the BTH region. Finally, Kriging interpolation was used to characterize the spatial distribution of extreme heat events.



Figure 2. Mann-Kendall mutation test results for the regional mean TXx index over the BTH region.

3. Results

3.1. Climatic Characteristics of Temperature over the BTH Region

The climatic features of temperature are provided as a background to understand the changes in temperature extremes over the BTH region during recent decades. There were evident seasonal differences in the monthly mean values of daily mean temperatures and daily maximum temperatures (Figure 3). Both the daily mean temperatures and the daily

maximum temperatures were obviously higher in summer (June, July, and August) and lower in winter (December, January, and February). During 1979 to 2020, the 12-month mean value of daily mean temperatures was 12.1 °C; the highest monthly mean of daily mean temperatures was in July, at 26.1 °C, while the lowest monthly mean of daily mean temperatures was in January, at -4.4 °C (Figure 3a). The features of the monthly mean values of daily maximum temperatures (Figure 3b) were consistent with those of daily mean temperatures (Figure 3a). The highest and lowest monthly means of daily maximum temperatures were also in July and January, at 31.1 °C and 1.7 °C, respectively. The summer mean values of daily mean temperatures and daily maximum temperatures were 25.4 °C and 30.6 °C, respectively, and were apparently higher than those for the other seasons. Thus, we studied the variation characteristics of extreme heat events in summer.



Figure 3. Monthly mean values of daily mean temperatures (**a**) and daily maximum temperatures (**b**) for 1979 to 2020 over the BTH region.

There were temperature gradients between the south and north of the BTH region, where the summer mean values of both daily mean temperatures (Figure 4a) and daily maximum temperatures (Figure 4b) were higher in the south and lower in the north. The summer mean values of daily mean temperatures and daily maximum temperatures ranged from 25 to 27 °C and from 31 to 33 °C, respectively, in areas south of 40° N, and they ranged from 21 to 25 °C and from 27 to 31 °C, respectively, in areas north of 40° N. This spatial pattern of being higher in the south and lower in the north was also detected in the temperature extremes. Over regions south of 40° N, TXx was usually higher than 35 °C, and the highest values, above 39 °C, were detected over the southern parts of Hebei Province (Figure 4c). Consistent with TXx, the Htd value was higher in the south and lower in the north of BTH region (Figure 4d). Htd was 15 to 18 d over the southern parts of Hebei Province, while it was only 0 to 3 over the regions north of 40° N.

We statistically calculated the spatial distribution of the correlation coefficients between the extreme heat event indicators of each station over the BTH region and the regional mean over the BTH region from 1979 to 2020, to investigate the influence of the topographic features of the BTH region on the changes in extreme heat events. The results show that the correlation coefficients of TXx for all stations over the BTH region and the whole regional mean were above 0.5 and most stations had correlation coefficients above 0.7, showing a good correlation. The Htd values of most stations over the BTH region also showed a strong correlation, and only five stations showed a weak correlation (0.2 < r < 0.4) with the BTH regional mean, which had a small effect on the whole regional mean. Therefore, the influence of topographic features on extreme heat events over the BTH region was weak, and the spatial and temporal variation characteristics of the mean values of extreme heat events can summarize the variation characteristics of extreme heat events in the whole BTH region.



Figure 4. Spatial distribution of summer mean values of daily mean temperatures (**a**), daily maximum temperatures (**b**), TXx (**c**), and Htd (**d**) over the BTH region during 1979 to 2020.

3.2. Interdecadal Variation in Summer Extreme Maximum Temperatures over the BTH Region during 1979 to 2020

There were evident interdecadal differences in TXx between P1 and P2. In the 1980s and the early 1990s, the TXx value of the BTH region fluctuated steadily, but it then suddenly increased in the mid-1990s until the early 2010s, from which point the TXx value of the BTH region remained high. In 2018, TXx began to decline over the BTH region. In general, TXx showed a significant positive linear trend from the summer of 1979 to 2020. In different time periods, TXx showed a downward trend in P2 and a slight upward trend and weak volatility in P1 (Figure 5a).



Figure 5. Cont.



Figure 5. (a) Time series (dot line) and linear trends (dash lines) of TXx over the BTH region during 1979–2020; (b) violin plots of TXx for different periods; (c) linear change trend of TXx (\oplus means that it passed the 99%-significance test).

The violin plot of TXx during different periods also showed clear interdecadal differences between P1 and P2 (Figure 5b). Obviously higher values and larger interannual variabilities were observed during P2. During P1, the value of TXx was mainly concentrated between 36 °C and 37 °C, with a mean value of 37 °C. However, during P2, it mainly concentrated in the temperature ranges of 37 °C to 38 °C and 39 to 40 °C, with a mean value of 38 °C. The mean value for P2 was higher than both that for P1 and that for the entire study period. In general, against the background of global warming, TXx in the BTH region showed an increasing trend during the whole study period, and it showed obvious interdecadal variation characteristics.

There were differences in the linear change trend of TXx in different regions, but the overall trend was one of the increases over the BTH region (Figure 5c). TXx showed an increasing trend at 158 (90.8%) stations, and most of the stations had a larger and more significant TXx growth rate (passing the 99%-significance test) in Beijing and Eastern Hebei Province. The stations showing a weakly decreasing trend for TXx were mainly concentrated in Central and Eastern Hebei Province.

An evident rise in TXx was observed over nearly the entire BTH region between the two periods, particularly in the northeastern parts. During P1, TXx was usually above 37 °C over Central and Southern Hebei Province, between 35 and 37 °C for Beijing City and Tianjin City and below 35 °C over Northern Hebei Province (Figure 6a). Compared with those during P1, during P2, areas with TXx above 37 °C were extended to Beijing and Tianjin, while areas with relatively high temperatures of 39 °C were extended to Shijiazhuang City in Southern Hebei Province and Central Hebei Province. The area with a relatively low TXx of 35 °C was narrowed to a small part of the northern mountainous area of Northern Hebei Province (Figure 6b).

Positive differences in TXx between P2 and P1 were observed over the entire BTH region, except for Xingtai City in Southern Hebei Province (Figure 6c). Apparently, the rise in TXx was larger in the northern parts of the BTH region during recent decades. The difference was less than 1.0 °C in the southern parts of Hebei Province, but it was larger than 1.0 °C in the central and northern parts of the BTH region. A relatively larger difference was detected in the northeastern parts, with a rise of 1.5-2.0 °C, and the largest difference was in Beijing City, with a rise of 2.0-2.5 °C. We note that there were small or negative differences in TXx between P2 and P1 over regions such as Handan, Xingtai, Hengshui, and Cangzhou. This may be related to the influence of irrigation in Southern and



Central Hebei. Irrigation has a certain cooling effect on the daily maximum temperature, which weakens the influence of urbanization [32,33].

Figure 6. Summer mean values of TXx for P1 (**a**) and P2 (**b**); and (**c**) the differences of summer mean values of TXx between P2 and P1.

According to our statistical analysis of the data, the interdecadal change in the monthly TXx was also evident (Table 2). The monthly scale change for TXx in different interdecadal (P1 and P2) periods is represented by the number of stations. The statistical method was as follows: For each month in summer (June to August), we calculated the total number of stations reporting TXx in that month for each year in periods P1 (16a) and P2 (24a). The numbers of stations in each year were added for all of P1 or P2, and the result was divided by the total number of years in period P1 or P2 separately to give the monthly scale distribution of TXx. The number of TXx stations in the BTH region decreased in June and increased in July from P1 to P2. During P1, June was the month with a dominant TXx occurrence for the BTH stations, while during P2, the occurrences of TXx in June and July were nearly equal. This increase in TXx in July may have resulted from more long-lasting heat waves or much hotter temperatures in July in P2 [34].

Period/Month	1979–2020	1979–1994	1997–2020
June	91	97	86
July	73	66	88
August	10	17	10

Table 2. Numbers of TXx stations in different months of summer by the period over the BTH region (number).

We analyzed the distribution of the indicator TXx in Table 2 in two different periods by superimposing the wind field and the geopotential height field model (the figure was omitted). It was concluded that the TXx values in June and July were influenced by warm wind anomalies and sinking air, resulting in different periods of P1 and P2. The occurrence of the TXx in August during P2 may be influenced by cold and warm advection.

3.3. Interdecadal Variation in Summer High-Temperature Days over the BTH Region during 1979 to 2020

Interdecadal variation in temperature extremes over the BTH region was also evident in the results for Htd between the two periods. Htd showed a downward trend from 1979 to the mid-1990s; It suddenly rose in the late 1990s and remained high until the mid-2000s and then showed a downward trend. Therefore, Htd showed a downward trend in different periods of P1 and P2, and the change of standard deviation reflected the greater dispersion and volatility of Htd in P2 (Figure 7a). There were some similarities in the long-term changes in Htd and TXx. The summer mean values of Htd and TXx were both lowest in the 1980s and the early 1990s, but they abruptly shifted to high values in the mid-1990s, with a negative trend in P2. The mean values and interannual variabilities of Htd in P2 were obviously larger than those in P1 and in the entire study period (Figure 7b), which was the same as TXx. In the whole period, the mean value of Htd was 9 d, and its minimum value was 3 d. During P1, the value of Htd was mainly concentrated between 4 and 6 d, with a mean value of 7 d. The mean value for P2 was higher than that for P1, which was 12 d. During P2, Htd was mainly concentrated between 6 and 9 d.



Figure 7. (a) Time series (dot line) and linear trends (dash lines) of Htd over the BTH region during 1979–2020; (b) violin plots of Htd for different periods; (c) linear change trend of Htd (\oplus means that it passed the 99%-significance test).

Almost the entire BTH region showed an increasing trend for Htd, and it decreased at only three stations, with values from -0.2 to 0.0 d/10a (Figure 7c). Most of the stations in the three major cities, Beijing City, Tianjin City, and Shijiazhuang City, had relatively large growth rates and a significant increasing trend (passing the 99%-significance test).

In the whole study period, the summer Htd was mainly concentrated in July over the BTH region. The mean proportions of Htd in June to August in summer were 44.4%, 46.2%, and 9.4%, respectively. In June, the proportion of Htd was usually below 30% over the northern mountainous Hebei Province, and the proportion of Htd was usually between 40% and 60% over Central and Southern Hebei Province (Figure 8a). In July, the proportion of Htd was above 50% over nearly the entire BTH region, accompanied by a northward

migration of the regions with a high proportion (Figure 8b). Compared with those in June and July, the proportion of Htd was significantly decreased in August over the BTH region, at less than 30% (Figure 8c).



Figure 8. The proportions of Htd in June (**a**), July (**b**), and August (**c**) to summer totals for the period 1979 to 2020; the proportions of Htd in June (**d**), July (**e**), and August (**f**) to summer totals for P1; the proportions of Htd in June (**g**), July (**h**), and August (**i**) to summer totals for P2; the difference of the proportions of Htd in June (**j**), July (**k**), and August (**l**) to summer totals between P2 and P1.

The monthly mean proportion and spatial distribution of Htd had certain regional variation characteristics between different decades over the BTH region. The proportion of Htd decreased in June and increased in July from P1 to P2. This is consistent with the interdecadal change in TXx monthly statistics in Table 2. During P1, the proportion of Htd was relatively high in June, reaching 55.2%. The high value areas were mainly concentrated in Eastern Hebei Province, accounting for more than 70%. During P2, the proportion of Htd was only 38.2% in June. In July, the proportion of Htd was increased in P2, and the area of the high proportion expanded from Chengde City to the northern mountainous Hebei Province. In August, the proportion of Htd was usually below 30% in P1 and P2 over the BTH region. Further analysis of the difference between periods P1 and P2 of Htd over the BTH region was conducted. It can be seen more visually that in June, the proportion of Htd decreased significantly in almost the entire BTH region, except for the mountainous areas in Northern Hebei Province. In particular, the largest decrease in the proportion was observed in Eastern Hebei Province (Figure 8j). In July, the largest increase in Htd was observed in the northern region of Zhangjiakou City in Northern Hebei Province, and the proportion of Htd in Eastern Hebei Province also increased significantly during P2 (Figure 8k). In August, the proportions of Htd in Beijing and Eastern Hebei Province increased significantly, while the rates of increase in Central and Southern Hebei Province were insignificant (Figure 81).

4. Discussion and Conclusions

In this study, based on the daily maximum temperature dataset from 174 stations in BTH during summers from 1979 to 2020, two extreme heat event indices—the extreme maximum temperature (TXx) and the number of high-temperature days (Htd)—were selected to analyze the spatial and temporal changes in extreme heat events in the Beijing–Tianjin–Hebei region at different scales, such as monthly, annual, and interdecadal. Based on the results of the study, our main findings are as follows:

- (1) During the period 1979–2020, extreme heat events showed an overall upward trend, and TXx and Htd reflected significant interdecadal differences and some similarities in the BTH region. Before the mid-1990s (P1), both TXx and Htd were low values. After the mid-1990s (P2), both indices showed an interrupted increase to high values, but a decreasing trend was observed in the later period.
- (2) Extreme heat events primarily occurred in the southern part of the BTH region. The most significant interannual changes in TXx were concentrated in Beijing City, Tianjin City, and the Northeastern Hebei Province, with most regions experiencing an increase in TXx by 1.5–2.0 °C. Notably, the Handan–Xingtai–Hengshui–Cangzhou area exhibited either negative or small TXx values.
- (3) In regions experiencing a notable increase in Htd over different decades, there was a discernible migration of high-value areas from south to north. Specifically, in the background of global warming, Htd increased most significantly in Beijing, Tianjin, and Shijiazhuang Cities.
- (4) In terms of interdecadal variation, the extreme heat events in the BTH region showed a decreasing trend in June and an increasing trend in July. An increase in the number of stations reporting TXx in July was observed from P1 to P2. For Htd, the number of high-temperature days in July contributed the most over the whole summer. From P1 to P2, the percentage of Htd in July increased for almost the entire BTH region.

The frequent occurrence of extreme heat events has many impacts on social and economic development and human health over the BTH region. Therefore, understanding the characteristics and trends of extreme heat events is crucial for the sustainable development of rapidly urbanized regions. This study mainly divided the BTH into small regions based on the geographical location and analyzed extreme heat events based on a single station per region. In this study, the interannual and inter-monthly spatiotemporal variation characteristics of the extreme heat event index during P1 and P2 showed a downward trend during P2, which may be related to extreme precipitation and land irrigation [32,35]. At the same time, we also found spatial characteristics of regional differences between the high extreme heat events in the south and the low extreme heat events in the north over the BTH region, especially the proportions of Htd in different years and months, which can provide a reference for future regional disaster prevention and reduction. In addition, the increase in TXx can reach 1.5–2.0 °C in big cities such as Beijing and Tianjin, which may be related to the dense population in big cities and the accelerated urbanization process [36].

Extreme heat events have become more obvious and more frequent in response to global warming, and further studies are needed to discuss their causes and effects over the BTH region. Extreme heat events in urban agglomerations are the result of climate change, urbanization, and atmospheric circulation, and their mechanism is more complex [37,38]. Summer precipitation [38], subtropical highs, and ENSO [39] are also important factors affecting extreme heat events [40,41]. Xie et al. [42] analyzed the interdecadal variation of extreme high-temperature days from June and early July to midsummer in North China from 1981 to 2021. They found that there is a significant interdecadal cycle of extreme heat events in North China and its annual variability is related to the Indian Ocean Pacific Warm Pool and the Northwest Pacific Dipole (IPOD). We have calculated the correlation coefficients between the extreme heat events indices TXx and Htd at different time periods over the BTH region and the modes indices at different rates based on previous research results (Table 3). The results showed that during the P1 period, extreme heat events over the BTH region were mainly regulated by PDO, which played a positive role. The correlation coefficients between PDO and TXx and Htd were 0.35 and 0.55, respectively. Monsoon intensity mainly played a negative role. During P2, monsoon intensity positively affected the interannual variation of extreme heat events over the BTH region, while TBO played a negative role. Therefore, in future studies, we will focus on the influence of PDO and the monsoon intensity on extreme heat events over the BTH region to reveal the physical mechanisms of their variability. In addition, regional climate models can be further combined to study future changes in extreme heat events in the BTH region and improve the region's ability to cope with climate change and extreme heat events.

Periods	Index	PNA	PDO	ENSO	ТВО	Monsoon Intensity
1979–2020	TXx	0.26	-0.05	0.07	-0.04	0.2
	Htd	0.16	0.03	0.13	-0.01	0.3
1979–1994 (P1)	TXx	0.27	0.35	-0.27	-0.08	-0.4
	Htd	0.08	0.55 *	0.05	-0.02	-0.2
1997–2020 (P2)	TXx	0.15	0.13	0.16	-0.02	0.35
	Htd	0.03	0.24	0.14	-0.04	0.41 **

Table 3. Correlation coefficients of TXx and Htd with different modes at different periods.

** represents significance p < 0.01, * represents significance p < 0.05, and no * indicates that the correlation is not significant.

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