

Climate Extremes Related with Temperature Change Point Detection in Pambar Kottakaraiyar Basin

P. SUPRIYA*

Department of Civil Engineering, Centre for Water Resources, Anna University, Chennai, India.

Abstract

Global climate change has changed the trend of climate variables. Also there is change in intensity, frequency and cyclic pattern of climate extremes such as flood, drought, heatwaves and tropical cyclones in the southern part of India. The high temperatures and further increase pose serious socio-economic and environmental impacts. There is an urgent necessity to know about the regional level climate extremes and their adaptation strategies especially for the drought prone and rain fed basins. This paper discusses about the temperature trend and change point over a long term historical time period of 30 years (1992-2021). Based on the Man-Kendall method and Sen's test, the temperature over the basin is showing a significant rising trend with positive slopes in almost all the months, seasons and annual statistics. The change points of mean temperature are observed in 2008 for both Kundrakudi and Pudukottai climate stations. The minimum temperature change point was identified in 1998 and 2009 years for the Kundrakudi climate station. The results of this paper will be helpful in capacity building of specialised team on extremes risk, vulnerability and sector specific indices for temperature for the water resources and agricultural sectors under changing climate.



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Introduction

The latest sixth assessment report was published by Intergovernmental Panel on Climate Change (IPCC), a scientific group of the United Nations (UN). Based on this report, the global warming will reach or exceed 1.5°C even if the world currently adapts very low greenhouse gas emissions scenarios.¹

Global warming due to the increase of greenhouse gases is a major threat to the all the living beings and environment. All the meteorological parameters are related to global temperature, which alters the energy budget and hydrological cycle. The aerosol increase in the atmosphere due to the burning of fossil fuels alters the carbon content results in

CONTACT P. Supriya ✉ psupriya86@gmail.com 📍 Department of Civil Engineering, Centre for Water Resources, Anna University, Chennai, India.



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climate change.² The temperature extremes have environmental, economic and humanitarian effects over intense heat triggering enormous losses in the economy³ and growing loss of life rates worldwide.⁴ Several studies documented the record breaking extreme heat waves in different countries such as, Australia,⁵ United states,⁶ South Korea,⁷ South Asia,^{8,9} China,¹⁰ North Africa¹¹ and Canada in the year 2021 with 500 human beings lost their lives and 180 forest fires reported.¹² Adaptation to heat waves related to individual behaviour, improving infrastructure facilities and modifying institutional policies.¹³ According to sustainable development goal (SDG) special report 2023, the intensity and frequency of extreme events of weather are by this time impacting all over the world which in turn needs immediate climate resilient and adaptation measures to achieve the SDG of climate action.¹⁴

The developing countries and under developed countries are not able to cope with the less adaptive capacity. The frequency and intensity of heat waves based events will increase. Hence the properties of recent past heat extremes to be understood well for planning and making decisions.¹⁵ In early March, 2022, India experienced unprecedented heatwave spell from March 11 to March 18, 2022. During the year 2022, Rajasthan and Maharashtra witnessed the maximum temperature as 40°C and 45°C respectively.¹⁶ In developing countries like India the agricultural activities are getting affected due to the increase in temperature especially crop failure and food security crisis. Around 80% of the water is utilized for the agriculture; the high heat waves reduce the soil moisture and require frequent irrigation. Thereby more water consumption and slowly inviting the drought conditions. Hence the current comprehensive research on Indian river basins requires deeper understanding of trends and change points of temperature. This study investigates the changes in temperature over a historical period of 30 years from 1992 to 2021. This study carried out to address the research questions, initially to find trend characteristics monthly, seasonal and annual time scales for temperature and second to when the shift in temperature occurred over the long term period. The study helps in mitigation and adaptation policy framework to decrease the future risk related to temperature extremes due to climate change.

Study Area

The Pambar Kottakaraiyar basin details were received from the Water resources division, Tamil Nadu Government. This basin is one among the 17 river basins of Tamil Nadu and the index map of the basin is shown in the Figure 1. The river basin is situated in the geographical coordinates of 9°30'0" N - 10°25'0" N latitude and 78°10'0" E - 79°0'0" E longitude. It is surrounded by Agniyar basin on north side, Cauvery basin on north-western side, Vaigai basin in the south and Palk-bay in the east. The areal extent of the basin is 5910.87 km,² covering 18 taluks inclusive of 27 blocks belongs to six districts. The basin contains the following sub basins, which are Pambar, Manimuthar and Kottakaraiyar. Physiographically, the basin is divided into discontinuous hillocks on the north-western side, Eastern Ghats mountain ranges and remaining part of the basin is a gentle sloping topography. About 50% of the basin area is occupied by Sivagangai district, the other districts are Ramanathapuram, Pudukkottai, Dindigul, Madurai and Trichy.^{17,18}

About 65% of land of the basin area is agricultural land of which groundwater irrigation is about 80%, 3.3% of land is reserved forest area, 1.23% is settlement, 3.1% comprises of tanks. The major part of 18.9% land is barren land and remaining covers the land affected by alkalinity, backwater creek, land with scrub and shrub and barren out-crop. It is called as "Basin of tanks", because it has 7602 tanks enclosed within its boundary. The ayacutt irrigated by these tanks is about 1,33,008 hectares of land. The inter-basin transfer of water is from Vaigai basin. The ground water resources capacity of the basin is found to be 811.97 M.cum. The basin comprises of water stressed Dindigul, Madurai, Ramanathapuram, Pudukkottai and Sivaganga districts. The major problem in this basin is decreasing of groundwater levels, aquifer system with massive and poor yielding and poor groundwater quality issues. Paddy, sugarcane, groundnut, maize, cotton etc. are the main crops grown in this basin which needs more water and thus making the farmers extremely dependent on monsoon. The basin has semi-arid climate and it experiences annual normal rainfall of 924 mm Trichy.^{17,18}

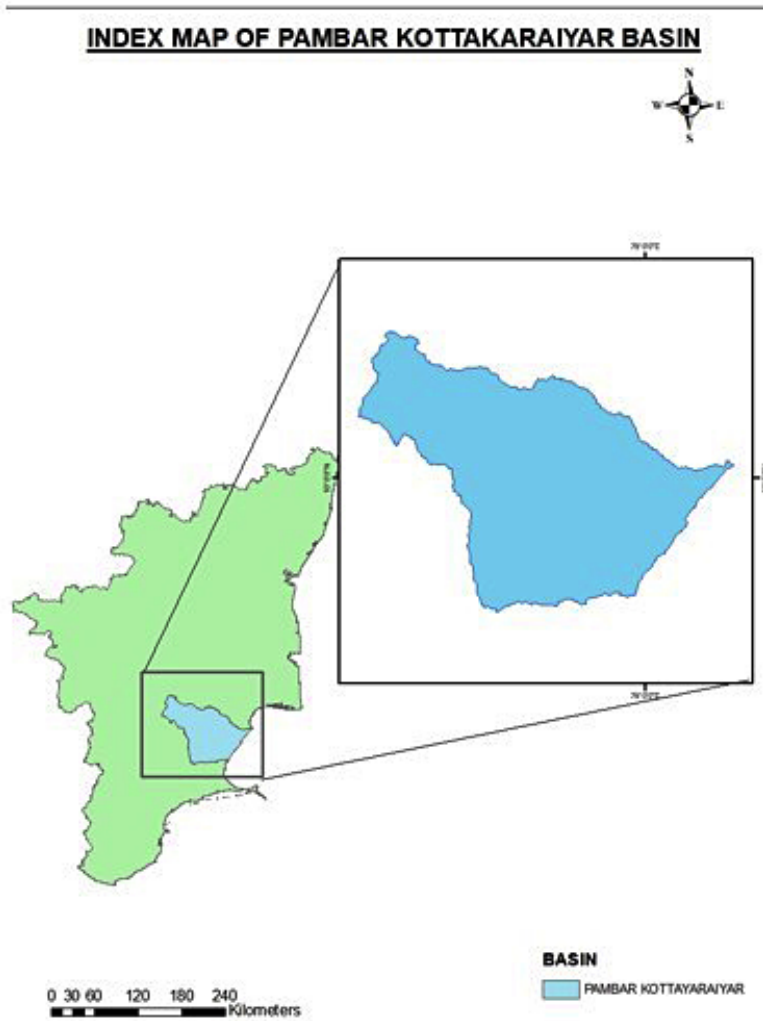


Fig. 1: Index map of Pambar Kottakaraiyar basin

Methodology

MK Statistical Test and Sen’s Slope Test for Trend Detection

The MK test^{19,20} and the Theil-Sen slope trend detection test^{21,22} were utilized for the trend analysis of temperature. The Mann-Kendall statistic S and standardized test statistics Z is given by,

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

$$\text{sign}(X_j - X_i) = \begin{cases} 1 & \text{if } X_j - X_i > 0 \\ 0 & \text{if } X_j - X_i = 0 \\ -1 & \text{if } X_j - X_i < 0 \end{cases} \quad \dots(2)$$

$$\sigma^2 = \frac{n(n-1)(2n+5) - \sum_{p=1}^q t_p(t_p-1)(2t_p+5)}{18} \quad \dots(3)$$

$$Z = \begin{cases} \frac{s-1}{\sigma^2} & \text{for } S > 0 \\ 0 & \text{for } S = 0 \\ \frac{s+1}{\sigma^2} & \text{for } S < 0 \end{cases} \quad \dots(4)$$

The parameters of statistics are xi and xj are the sequential data values in the years i and j, n is the number of data values in the record, t_p is the count of ties for the pth values and q is the count of tied values.

$$\beta = \text{median} \frac{x_i - x_j}{i - j} \dots \dots \dots j < i \dots (5)$$

where x_i and x_j are the sequential data values of the time series in the years i and j , and β is the magnitude of the trend slope of series values.²³

Changeover Point Detection Method

A changeover point analyser can detect multiple changes. The detection of changeover point method is an efficient statistical tool used to indicate the

erratic variability of climate in the long term climate data sequences. The hydrological cycle is recently undergoing major changes and the identification of the changeover point in climate data series is in need of the hour. The revealing of changeover point method plays a vital role in the hydrology-climate change based research. The two climate stations as shown in Figure 2, records observed temperature data. The daily data of temperature is collected from Statistical department, Chennai for the period of 1992 to 2021 (30 years).

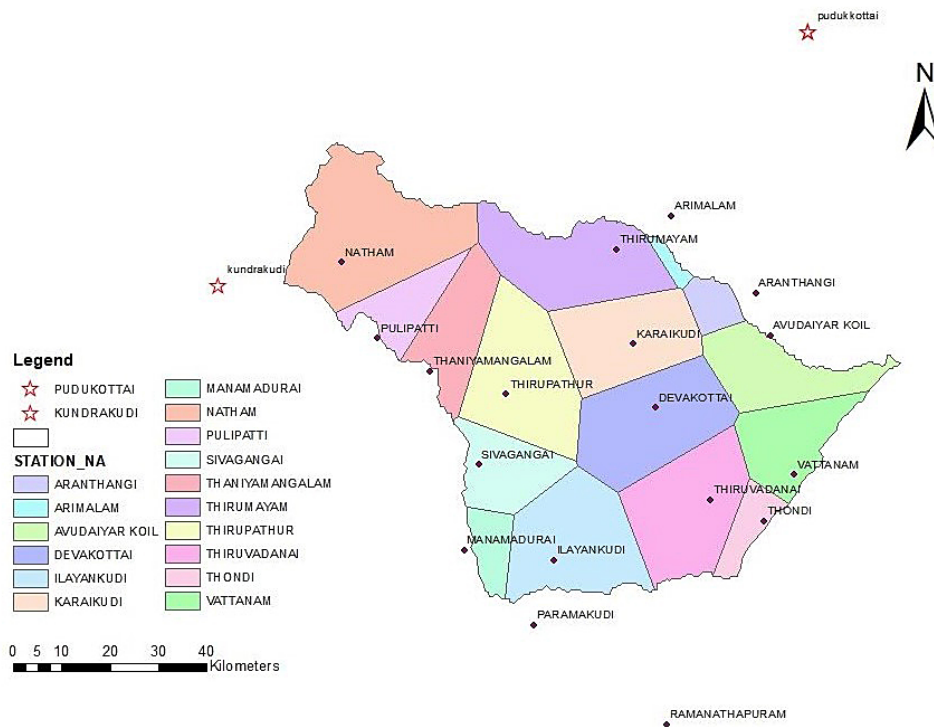


Fig. 2: Rain guauge and climate stations of Pambar Kottakaraiyar basin

The method is used by Taylor,²⁴ carried out the change point analysis iteratively by a combination of boot strapping method and cumulative sum charts (CUSUM) to identify changes. The cumulative sums K_i is estimated by the equation 6 is as follows,

$$K_i = K_{i-1} + Y_i - \bar{Y} \dots (6)$$

Where,
 K_0 = zero, Initial accumulative sum K_0 ,
 $i = 1, 2, 3, \dots, 25$,
 \bar{Y} is the mean of the trial series.

The cumulative sum of differences between values and mean. An upward slope for a particular period shown in the CUSUM chart specifies that the values are above on the whole average. A downward slope for a certain period in the CUSUM chart indicates that the values are below the whole average. A sudden shift in the CUSUM chart represents sudden variation in the mean. The data series consists of two averages which are divided into fragments and using the repetitive procedure average square of evaluations is calculated until it reaches the minimization of average square of error.

The significance of the changeover point is evaluated with the help of confidence level based on bootstrapping method is as given in equation 7,

$$\text{Confidence interval} = Q/N * 100 \quad \dots(7)$$

here,

$K\sim$ = change between the high and least CUSUM entries,

Q = the total of bootstrapped $K\sim$ entries which are higher than the baseline $K\sim$ values,

N = number of bootstraps.

The changeover point detection is performed with the help of a software works in Microsoft excel named as changeover point analyser. The analyser can easily detect the precise year when the shift is occurred by using CUSUM charts and MSE. The multiple notable changeover points in the total dataset are identified by level of variation and confidence levels. The likelihood of changeover point is computed by the equation 2 and recognised by the rise and fall line in the CUSUM plots. The values of the variable generally fluctuate between the upper and lower limits if there is no change existing in the series.

Results and Discussions

Analyzing Month Wise, Seasonal and Yearly Temperatures of Kundrakudi Station

The MK test is adopted for the temperature series monthly, seasonal (monsoon), and yearly time scales

are depicted in Table1 and Table 2. The previous data of 31 years were used to the drift detection and changeover point identification analysis. Yearly average temperature of T_{min} , T_{mean} is showing an increasing trend and T_{max} is noticed as having no trend. When α is equal to 0.05, the statistically significant drift is present in the sequence. The T_{max} in the July, August, October months showed higher increasing drift with highest Z values as 3.62, 2.94, 2.33 respectively. The T_{min} in the January, April, June, July, August, October and December months indicated a higher increasing drift with highest Z numeral as represented in Table 1. The T_{mean} shown that the October, November and December months is having significant rising drift with the uppermost Z entries 2.25, 2.07 and 2.18 respectively. The seasonal statistics of T_{max} in NEM and SWM shows an increasing drift with the maximum Z value of 2.14 and 1.19 respectively. The T_{min} in Summer, NEM, SWM and Annual periods specified a higher rising drift with highest Z entries as shown in Table 1. The T_{mean} indicated a maximum rising drift with peak Z values 3.46 for NEM, 3.34 for SWM and 2.82 for Annual periods. The Sen's slope (Theil, 1950 & Sen, 1968) magnitude values of T_{max} , T_{min} and T_{mean} present in most of the months and seasons shows a significant rising trend of temperature over the entire basin. The highest values of T_{max} as 43.3°C in 2016 and T_{min} as 29.64°C in 2019 were recorded in Kundrakudi climate station.

Table 1: MK test statistics for month wise, seasonal and yearly temperatures of Kundrakudi climate station

TIME SCALE	T_{max}				T_{min}				T_{mean}			
	Z value	Sen's value	P value	Trend	Z value	Sen's value	P value	Trend	Z value	Sen's value	P value	Trend
JANUARY	0.48	0.015	0.630	NT	2.80	0.054	0.005	IT	1.53	0.032	0.125	NT
FEBRUARY	-0.55	-0.020	0.580	NT	0.75	0.028	0.453	NT	0.12	0.007	0.901	NT
MARCH	-1.94	-0.030	0.052	NT	1.80	0.056	0.072	NT	0.34	0.005	0.735	NT
APRIL	0.09	0.002	0.929	NT	2.12	0.047	0.034	IT	1.00	0.025	0.318	NT
MAY	-0.73	-0.026	0.464	NT	1.18	0.019	0.239	NT	-0.10	-0.003	0.915	NT
JUNE	0.99	0.034	0.318	NT	3.21	0.045	0.001	IT	1.61	0.037	0.108	NT
JULY	3.62	0.134	0.000	IT	2.69	0.037	0.007	IT	3.75	0.085	0	NT
AUGUST	2.94	0.078	0.003	IT	3.16	0.032	0.002	IT	3.50	0.055	0	NT
SEPTEMBER	1.53	0.063	0.125	NT	1.11	0.012	0.269	NT	1.71	0.039	0.087	NT
OCTOBER	2.33	0.113	0.019	IT	2.30	0.046	0.021	IT	2.25	0.076	0.025	IT

NOVEMBER	1.26	0.049	0.205	NT	1.25	0.043	0.212	NT	2.07	0.042	0.038	IT
DECEMBER	1.19	0.037	0.232	NT	2.93	0.085	0.003	IT	2.18	0.054	0.03	IT
Seasonal Statistics												
WINTER	2.14	-0.008	0.803	NT	1.64	0.061	0.101	NT	1.11	0.034	0.269	NT
SUMMER	-1	-0.059	0.318	NT	2.86	0.137	0.004	IT	0.62	0.039	0.532	NT
SWM	1.19	0.299	0.002	IT	3.18	0.137	0.001	IT	3.46	0.198	0.001	IT
NEM	2.14	0.192	0.032	IT	3.43	0.162	0.001	IT	3.34	0.187	0.001	IT
Annual Statistics	-1.2	-0.036	0.232	NT	3.14	0.053	0.002	IT	2.82	0.037	0.005	IT

Table 2: MK test statistics for month wise, seasonal and yearly temperatures of Pudukottai climate station

TIME SCALE	T_{max}				T_{min}				T_{mean}			
	Z value	Sen's value	P value	Trend	Z value	Sen's value	P value	Trend	Z value	Sen's value	P value	Trend
JANUARY	-0.66	-0.018	0.509	NT	1.61	0.037	0.108	NT	0.09	0.003	0.929	NT
FEBRUARY	-1.09	-0.04	0.276	NT	0.11	0.004	0.915	NT	-0.50	-0.012	0.643	NT
MARCH	-2.11	-0.036	0.035	DT	1.93	0.063	0.054	NT	0.86	0.018	0.392	NT
APRIL	-0.25	-0.013	0.803	NT	1.34	0.039	0.181	NT	0.61	0.013	0.544	NT
MAY	-0.5	-0.017	0.617	NT	1.29	0.017	0.199	NT	0.00	0.000	1.000	NT
JUNE	0.517	0.016	0.605	NT	1.41	0.022	0.159	NT	1.14	0.017	0.254	NT
JULY	2.21	0.071	0.027	IT	2.28	0.031	0.022	IT	2.57	0.05	0.01	IT
AUGUST	0.48	0.013	0.63	NT	0.80	0.006	0.422	NT	0.71	0.011	0.475	NT
SEPTEMBER	0.46	0.015	0.643	NT	0.36	0.005	0.721	NT	0.34	0.01	0.735	NT
OCTOBER	1.21	0.015	0.643	NT	1.52	0.027	0.129	NT	1.25	0.038	0.212	NT
NOVEMBER	1.07	0.042	0.284	NT	1.59	0.048	0.112	NT	2.36	0.048	0.019	IT
DECEMBER	0.46	0.01	0.643	NT	1.69	0.045	0.090	NT	0.89	0.022	0.372	NT
Seasonal Statistics												
WINTER	-1.07	-0.058	0.284	NT	0.93	0.036	0.354	NT	-0.10	-0.002	0.943	NT
SUMMER	-1.18	-0.073	0.239	NT	2.41	0.134	0.016	IT	1.12	0.047	0.261	NT
SWM	1.42	0.095	0.153	NT	1.53	0.061	0.125	NT	1.53	0.080	0.125	NT
NEM	1.21	0.132	0.225	NT	2.44	0.117	0.015	IT	2.18	0.108	0.03	IT
Annual Statistics	-1.11	-0.025	0.269	NT	1.64	0.024	0.101	NT	1.71	0.020	0.087	NT

Analyzing Month Wise, Seasonal and Yearly Temperatures of Pudukottai Station

The results of annual average temperature of T_{min} , T_{mean} and T_{max} are detected as having no trend. When α is equal to 0.05, there exists a statistically significant drift in the series. The T_{max} in the July month indicated a significant larger increasing drift with major Z value of 2.21. There is a significant decreasing trend observed in T_{max} in the month of

February with the Z value of -2.11. The T_{min} in the July month specified a higher increasing trend with highest Z value as 2.28. The seasonal statistics of T_{min} in Summer and NEM shows an increasing trend with the maximum Z value of 2.41 and 2.44 respectively. The T_{mean} shown that the July and November months are having significant increasing trend with the maximum Z values 2.57 and 2.36 respectively. The T_{mean} in NEM period indicated a

larger rising drift with a maximum Z value as 2.18. The T_{max} , T_{min} and T_{mean} of most of the months and seasons are having positive Sen's slope magnitude values that indicates that there exists a significant

escalating drift of temperature all over the basin. The highest values of T_{max} as 43.6°C in 2016 and T_{min} as 29.75°C in 2019 was recorded in Pudukottai climate station.

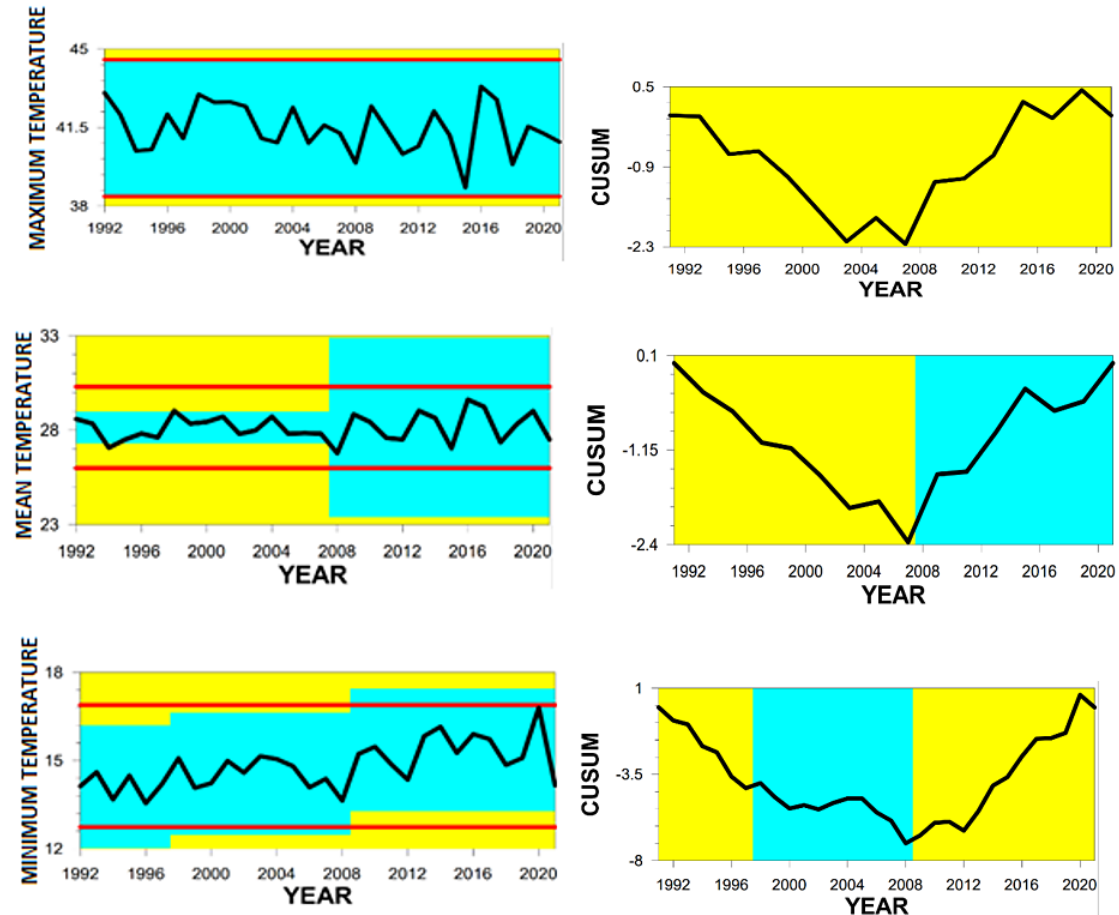


Fig. 3: Change points and CUSUM chart for annual temperature for Kundrakudi station.

The identification of change points is achieved through the statistical method which shows a vital role in recognizing the jumps in temperature variable belongs to the long term climatological period. The annual temperature change points were identified in T_{mean} and T_{min} . The results revealed that change has happened during the examined period, which shows T_{mean} and T_{min} values appears outside the control limits as represented in Figure 3.

The levels shown in the Figure 5 and Figure 6 implies that change is occurred and it is closely related with climate change. The T_{mean} changeover point

is occurred in the year 2008 at a confidence interval of 95% at level 1. The T_{min} changeover point is occurred in the years 1998 and 2009 at a confidence interval of 92% and 96% and at level 3 and level 1 respectively. Before the happening of the change point the T_{mean} is 41.25°C in the year 2007 and after the change, it is 42.45°C in the year 2009. In the year 1997 before the change point the T_{min} is 19.8°C and after the change the T_{min} is 19.1°C in the year 1999. In the case of T_{min} , earlier the happening of change point is in the year 2008, the T_{min} is 18.9°C and after the change the T_{min} is 20.3°C in the year 2010.

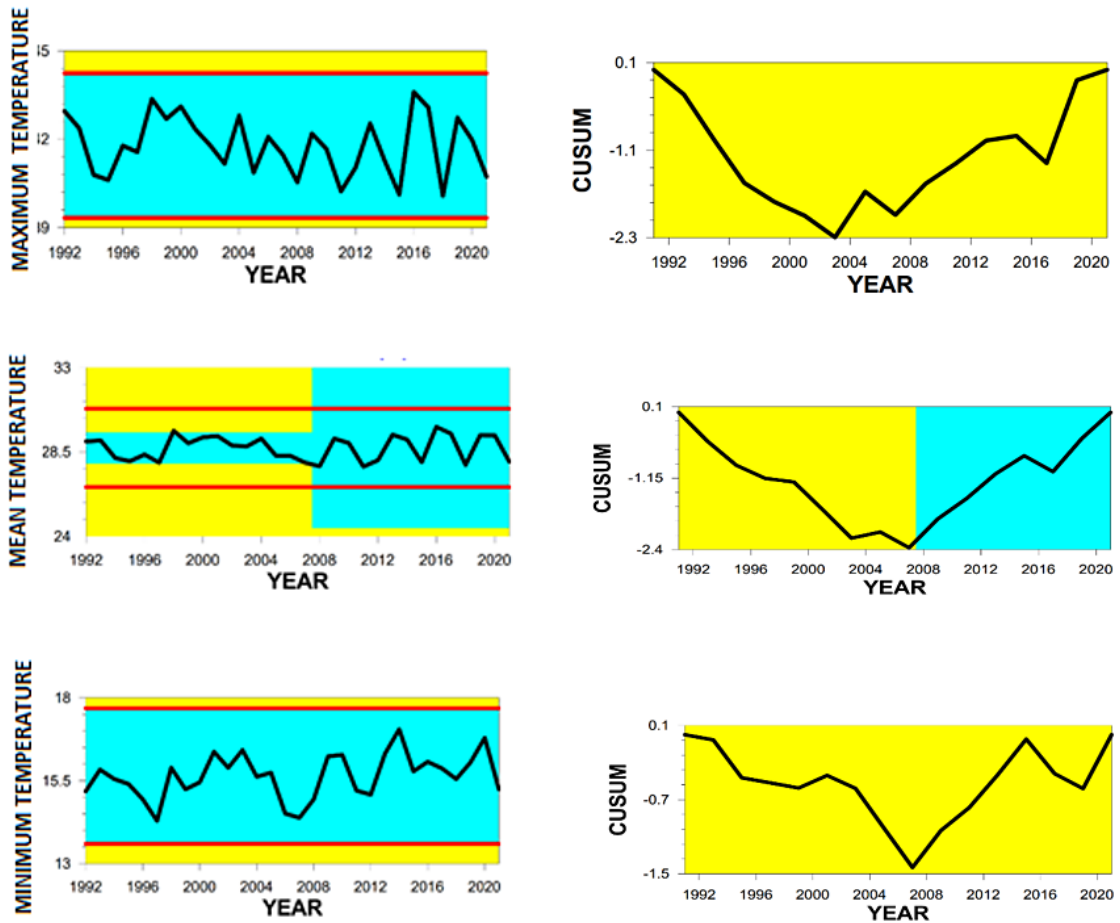


Fig 4: Changeover points and CUSUM chart for annual temperature for Pudukottai station.

YEAR	Confidence Interval	Conf. Level	From	To	Level
2008	(2006, 2016)	95%	0.27519	1.5778	1

Fig 5: Estimated change point years of mean temperature for Kundrakudi station.

YEAR	Confidence Interval	Conf. Level	From	To	Level
1998	(1993, 2006)	92%	14.112	14.553	3
2009	(2005, 2018)	96%	14.553	15.361	1

Fig 5: Estimated change point years of mean temperature for Kundrakudi station.

Analysis of Changeover Points for Pudukottai Station

The annual temperature changeover points were recognized in T_{mean} . The T_{mean} value falls exterior to

the control limits indicates that the jump has taken place during the data period of 1990 to 2021. The results revealed that in the year 2008, there is a climate jump identified in T_{mean} variable as depicted

in Figure 4. The confidence interval of the change point is 97% with the level 1 as clearly shown in Figure 7. Before the happening of the change point

the T_{mean} is 28.3°C in the year 2007 and after change the T_{mean} is 27.7°C in the year 2009.


YEAR	Confidence Interval	Conf. Level	From	To	Level
2008	(2006, 2012)	97%	0.27519	1.4258	1 

Fig 7: Estimated changeover point years of mean temperature for Pudukottai station.

Conclusion

The variability of temperature is due to the anthropogenic activities which are related to industrial growth that changes the climate all over the basin. The non-parametric Man-Kendall trend test and change point detection test by Taylor were given a remarkable result about temperature change all over the basin. Most of the results from the two climate stations reveals that the higher, least, and average temperatures have a significant higher rising drift. Based on the Kundrakudi climate station results, the T_{mean} change point is occurred in the year 2008 at a confidence interval of 95% at level 1. The T_{min} change point is occurred in the years 1998 and 2009 at a confidence interval of 92% and 96% and at level 3 and level 1 respectively. Based on the Pudukottai climate station results, in the year 2008, there is a climate jump identified in T_{mean} variable with a confidence interval of 97% with the level 1. The rapid variations in the land usage pattern and industrial growth alters the present climate and the cause for the increase in temperature. The basin is having less streamflow in the monsoon season and with a very long water scarce period with no streamflow prevailing drought condition. The results of climate based regional level study is indispensable for planning and management water bodies/ impoundments especially for the drought prone basins like Pambar and Kottakaraiyar. The climate

change based adaptation strategies for the farmers, hydrologists, water resource managers is in need of the hour to counteract the effects of temperature increase, drought and heat waves.

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Conflict of Interest

The author declares no conflict of interest.

Data Availability Statement

The manuscript incorporates temperature datasets of two climate stations received from State ground and Surface Water Resources data centre was examined throughout this research study.

Ethics Statement

The study does not involve any experiment on humans and animals.

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