

**Future Impact of Climate Change on the Yield of Cocoa in Ondo State, Nigeria**

**Abstract**

This study was carried to determine the trend of cocoa yield and climatic variables and assessment of the impact of climate change on the future yield of cocoa in Ondo State, Nigeria. Annual trend statistics for cocoa yield and climatic variables were analyzed for the state using Mann-Kendall test for trend and Sen's slope estimates. Downscaled data from six Global Circulation Models (GCMs) were used to examine the impact of climate change on the future yield of cocoa in the study area. The results of trends analysis in Ondo State showed that yield decreased monotonically at the rate of 492.18 tonnes/yr ( $P < 0.05$ ). An increased significant trend was established in annual rainfall trend. While Maximum temperature, minimum temperature, and mean temperature all increased at the rate of 0.02 °C/yr ( $P < 0.001$ ). The ensemble of all the GCMs projected a mid-term future decrease of about 9,334 tonnes/yr by 2050 and a long-term future decrease of 13,504 tonnes/yr of cocoa by 2100. The economic implication of these is that, if the projected change in the yield of cocoa as predicted by the ensemble of all the GCMs should hold for the future, it means that Ondo state may experience a loss of about \$22,470,018.22 and \$32,308,584.32 by the year 2050 and 2100 respectively according to the present price of the commodity in the world market. This research should be extended to other cocoa producing areas in Nigeria.

25 **Keyword:** Climate change; cocoa yield; climate variable; Mann-Kendall trend; future  
26 yield

27

## 28 **1. Introduction**

29 One of the most important cash crops contributing to the gross domestic product  
30 (GDP) of Nigeria is cocoa (*Theobroma cacao*) (Oyekale *et al*, 2009). It has contributed  
31 greatly to the economic development and social wellbeing of the people in the cocoa-  
32 producing areas and also boosted their financial status of the farmers after oil. The beans  
33 derived from cocoa is used in the production of chocolate products, biscuits, cocoa bread,  
34 cream, soap, livestock feeds, cocoa powder amongst others (Hamsat *et al.*, 2003;  
35 Olubamiwa *et al.*, 2000).

36 In the time past, Nigeria used to be the second largest producer of cocoa in the  
37 world and Ondo state was also the largest producing state but the production dwindled  
38 and currently the fourth producer in the World and due to some limiting factors, the  
39 production of cocoa declined drastically because of change in weather and climate  
40 change, management practices, oil exploration, etc (ICCO, 2008). Ayanlaja (2000)  
41 reported that cocoa production declined from 310,000 tonnes/yr despite increase  
42 insecticide application, land area, and introduction of a high yielding variety of cocoa in  
43 the country. Weather and climate change over the years has greatly affected cocoa  
44 production which is a major cash crop in Nigeria where Ondo state the worst hit of the  
45 menace.

46 The variation in the two climatic variables: Rainfall and temperature were  
47 discovered to have much influence on the sprouting, production, and growth of cocoa

48 trees (Anim-Kwapong and Frimpong, 2005). However, most of the developing countries  
49 are already experiencing low yield of the crop, as a result, extreme weather and climate  
50 change (Odjugo, 2010). Extreme weather is a situation best described as extreme in terms  
51 of historical distribution, severe or unfavorable weather (ICCO, 2003). Climate change  
52 was reported to have played a vital role in the alteration, development of cocoa pests and  
53 pathogens thereby shifting their interactions (Oyekale et al., 2009). This, in turn, leads to  
54 lower yield, which brings about low yield, which brings about reduced income and  
55 livelihood for the farmers. Cocoa production is highly sensitive to change in rainfall, the  
56 intensity of sunshine, temperature, water supply, soil condition due to evapotranspiration  
57 effects (Anim-Kwapong and Frimpong, 2005). Climate change has been reported to be  
58 one of the most serious environmental threats affecting humans and their crops in the  
59 world today (Enete and Amusa, 2010). It also has a great effect on agricultural production.

60         Unfortunately, the recent trends pattern of rainfall had either been excess leading  
61 to the infestation of black pod disease which also leads to losses in cocoa yield.  
62 Insufficient rainfall also leads to seed mortality, drought and bush burning. This gives us  
63 the opportunity to examine the trends and impact of climate change on cocoa yield in  
64 Ondo state.

65         Therefore, the aim of this study is to evaluate the trends in historical cocoa yield,  
66 climatic variables and determine the impact of climate change on the future yield of cocoa  
67 in Ondo state, Nigeria.

## 68 **2. Methodology**

### 69 **2.1 Study Area**

70 Ondo state is located within the rainforest agro-climatic zone of Southwest Nigeria. It lies  
71 between latitudes  $5^{\circ}45'$  and  $7^{\circ} 52'N$  and longitudes  $4^{\circ} 20'$  and  $6^{\circ} 5' E$ . The major  
72 occupation of the people is agriculture, which provides income and employment for about  
73 70% of the total population. The major arable crops cultivated include: yam, rice, cassava,  
74 tomatoes, maize, etc and some tree crops cultivated include: cocoa, coffee, oil palm and  
75 timber (OSMARD, 2004). Ondo state consists of 18 local government areas producing  
76 about 45 to 65% of the total cocoa production figures in Nigeria. OSMARD (2004)  
77 reported that 9 local government areas (LGAs) are producing about 95% of the total cocoa  
78 production in the state which include: Akure-North, Akure -South, Ondo- East, Ese Odo,  
79 Odigbo, Ile Oluji / Okeigbo, Ondo -West, Owo, and Ilaje.

## 80 **2.2 Data Source**

81 The climatic data used for this study was (rainfall, Maximum temperature, Minimum  
82 temperature and Mean temperature) were extracted between 1976 and 2014. These data  
83 were retrieved from the Climate Research Unit (CRU) dataset ([www.cru.uea.ac.uk](http://www.cru.uea.ac.uk)). The  
84 cocoa yield data was obtained from Ondo State Ministry of Agriculture and Natural  
85 Resources (between 1976 and 2014 and also from Food and Agricultural Organization  
86 statistics (FAOSTAT, [www.faostat.org](http://www.faostat.org)).

## 87 **2.3 Data Analysis**

88 To evaluate the trend in cocoa yield and meteorological parameters in the study  
89 area, MAKESENS (Mann-Kendall test for trend and Sen's slope estimates), An Excel  
90 template which was developed for detecting and estimating trends in the time series was  
91 used. The Mann-Kendall test statistic S is given by Salmi *et al.* (2002) as:

92 
$$S = \sum_{k=1}^{n-1} \sum_{j=k+1}^n \text{sgn}(x_j - x_k) \quad (1)$$

93

94 Wherein is the length of the time series  $x_1 \dots x_n$ , and  $\text{sgn}(\cdot)$  is a sign function,  $x_j$  and  $x_k$  are  
 95 valued in years  $j$  and  $k$ , respectively. The expected value of  $S$  equals zero for series  
 96 without trend and the variance is computed as:

97 
$$\sigma^2(S) = \frac{1}{18} \left[ n(n-1)(2n+5) - \sum_{p=1}^q t_p(t_p-1)(2t_p+5) \right]$$

98 (2)

99

100 Where  $q$  is the number of tied groups and  $t_p$  is the number of data values in  $p^{\text{th}}$  group. The  
 101 test statistic  $Z$  is then given as:

102 
$$Z = \begin{cases} \frac{S-1}{\sqrt{\sigma^2(S)}} & \text{if } S > 0 \\ 0 & \text{if } S = 0 \\ \frac{S+1}{\sqrt{\sigma^2(S)}} & \text{if } S < 0 \end{cases} \quad (3)$$

103 No assumptions as to the underlying distribution of the data are very significant as a non-  
 104 parametric test, The  $Z$  statistic was then used to test the null hypothesis,  $H_0$  that the data  
 105 are randomly ordered in time, against the alternative hypothesis,  $H_1$ , where there is an  
 106 increasing or decreasing monotonic trend. A positive (negative) value of  $Z$  indicates an  
 107 upward (downward) monotone trend.  $H_0$  will be rejected at a particular level of

108 significance if the absolute value of  $Z$  is greater than  $Z_{1-\alpha/2}$ , where  $Z_{1-\alpha/2}$  is obtained from  
109 the standard normal cumulative distribution tables. Hobbins et al. (2001) noted that the  
110 Mann-Kendall test is non-dimensional and does not quantify the scale or the magnitude of  
111 the trend but the direction of the trend. To estimate the true slope of an existing trend the  
112 Sen's non-parametric method will be used (Salmi *et al.*, 2002).

### 113 **3. Results and Discussion**

#### 114 **3.1 Descriptive trends in annual cocoa yield and climatic variables**

115

116 The summary statistics of the Mann-Kendall monotonic trend statistics and  
117 nonparametric sen's slope estimate test for annual trends in cocoa yield and climatic  
118 variables in Ondo State is presented in Table 1. The results of the analysis of trends  
119 showed that cocoa yield decreased monotonically at the rate of 492.18 tonnes/yr ( $P < 0.05$ ),  
120 which agrees with Oguntunde *et al.* (2014), that noticed a decreasing trend in cocoa yield  
121 in the study area which was attributed to variations in weather elements. No significant  
122 correlation was established in annual rainfall. While there was a positive significant trend  
123 in Max. temperature, Min. temperature and mean temperature all at the rate of 0.02 °C/yr  
124 ( $P < 0.001$ ). Similarly, the statistical trend of annual yields of cocoa and the climatic  
125 variable is presented in Figures 1 to 5. Cocoa Yield showed a declining temporal trend  
126 while Rainfall, Max. temperature, Min. temperature and mean temperature showed a  
127 positive statistical trend. This may be due variations in the amount of rainfall in the study  
128 area which is in line with the findings of Thompson, (2013) who carried out a study on the  
129 climate change and the cocoa production in Ekiti and Ondo States of Nigeria: A

130 cointegration analysis. He reported that the availability of rainfall will have much effect  
131 on cocoa yield over time.

132         There was also an increasing positive statistical trend for climatic variables during  
133 the time under study. This result also confirms the empirical study carried out by Oyekale  
134 *et al.* (2009) who reported that the reduction in the cocoa yield was as a result of  
135 excessive rainfall which was deduced in the time under study. These also reduce the  
136 quality of cocoa as a result of the climatic failure. In terms of correlation, rainfall was not  
137 significantly correlated with the yield of cocoa; Tmax, Tmin, and Tmean were the only  
138 variables that are significantly correlated with cocoa yield in the study area.

139

### 140 **3.2 Development of climate-yield regression Models**

141 The correlation between cocoa and climatic variables has given us an understanding of the  
142 time characteristics of each variable. Therefore, to establish a relationship between cocoa  
143 yield and climatic variables, the variables which were identified to have a significant  
144 relationship with the yield using multiple linear regression analysis were regressed with  
145 cocoa yield. The summary of stepwise regression between cocoa yield and climatic  
146 variables using multiple linear regression for the four states are presented in Table 2.

147 In the study area, the model I the correlation coefficient ( $R$ ) = 0.52 showing that  
148 the regressor ( $TY_{12}$ ) in the model I accounted for 52% in the variability of cocoa yield.  
149 Model II also have  $R = 0.68$  which implies that the regressors ( $TY_{12}$  and  $R_6$ ) are  
150 responsible for 68% variability in cocoa yield in Ondo State. Looking at Model III, where  
151  $R = 0.74$ , this implies that the regressors ( $TY_{12}$ ,  $R_6$ , and  $TX_5$ ) are responsible for 74% of  
152 the variability in cocoa yield. Examining Model IV, with  $R = 0.78$ , this simply means that  
153 the regressors in model IV ( $TY_{12}$ ,  $R_6$ ,  $TX_5$ , and  $TZ_3$ ) accounted for 78% in the variability  
154 in cocoa yield. Model IV from the stepwise regression analysis was also selected in order  
155 to predict the future yield of cocoa by 78% assurance based on RCP 4.5 emission  
156 scenario.

157 The Global Circulation Models (GCMs) for the projection of the future climate  
158 data by the IPCC based on the RCP 4.5 emission scenario were used for this study. This  
159 includes CCCMA, ICHEC, MIROC, NCC, NPI, and NOAA. The present-day cocoa yield  
160 estimation for the study area present daytime series (1976 - 2005) Midterm (2021-2050)  
161 and long term (2071-2100) for the six GCMs based on RCP 4.5 are presented in Figures 6  
162 to Figure 8.



163

### 164 **3.3 Impact of climate change on the future yield of cocoa in Ondo state**

165           Figure 9 shows the impact of climate change on the yield of cocoa in Ondo  
166 state. Looking at CCCMA model, a mid-term decrease of 7,413 tonnes/yr of cocoa was  
167 projected for the study area by the year 2050 and for the long term, a decrease of 10,383  
168 tonnes/yr of cocoa was projected for the study area by 2100. A decrease of 7,992  
169 tonnes/yr cocoa was projected by ICHEC model for the study area for the mid-term by the  
170 year 2050. For the long-term projection by ICHEC, a decrease of 11,852 tonnes/yr was  
171 projected by the year 2100 for the study area. Considering MIROC, also in Figure 9,  
172 15,960 tonnes/yr decrease yield of cocoa was projected by the year 2050 while a decrease  
173 of 28,146 tonnes/yr yield of cocoa was projected for the study area by the year 2100.

174           For NCC and at the same emission scenario, there will a mid-term future  
175 decrease of 8,926 tonnes/yr of cocoa by the year 2050 for the study area. For the long-  
176 term, a decrease of 8,162 tonnes/yr of cocoa was projected by the year 2100. With  
177 reference to MPI, there was a decrease of 6,335 tonnes/yr of cocoa for the mid-term future  
178 projection for the study area and decrease of 6,395 tonnes/yr in the long-term future was  
179 projected for the study area by the year 2100. For the NOAA model, there was a decrease  
180 in both mid-term and long-term future with 9,379 tonnes/yr and 16084 tonnes/yr of cocoa  
181 by the year 2050 and 2100 respectively for the study area. The ensemble of all the GCMs  
182 projected a mid-term future reduction of 9,334 tonnes/yr by 2050 and a long-term future  
183 decrease of 13,504 tonnes/yr of cocoa by 2100.

184 The study of the impact of climate change on the future yield of cocoa both by the  
185 midterm (2050) and long term (2100) in the study area cannot be overemphasized being  
186 the highest cocoa producing state. From the study, climate change will have a negative  
187 impact experienced in the study area. The variation in the future projected yield of cocoa  
188 may be due to variability in rainfall distribution across the study area by the year 2050 and  
189 2100. This agrees with Oluyole (2010); Edet *et al.* (2018); Amos and Thompson (2015)  
190 that variability in rainfall has much influence on the cocoa yield. Thompson (2013)  
191 established that the yield of cocoa is mostly affected by rainfall variability in the long run,  
192 that is, the yield of cocoa is highly susceptible to drought and excess rainfall.

193 Anim-Kwapong and Frimpong (2005) reported that cocoa is highly sensitive to  
194 rainfall and water application. Also, yearly variations in the yield of cocoa were affected  
195 by more by rainfall than any other factors in Nigeria (Ajewole and Iyanda, 2010).

196

### 197 **3.4 The economic implication of the impact of climate on cocoa yield**

198 The projected change in the future yield of cocoa using RCP 4.5 future climate  
199 scenario in the future for all the GCM, showed that a loss of 9,334 tonnes/yr of cocoa was  
200 projected by the year 2050 and a loss of 13,504 tonnes/yr of cocoa was also projected by  
201 the year 2100 Now, if the projected change in the yield of cocoa as predicted by the  
202 ensemble of all the GCMs should hold for the future, it means that Ondo state may  
203 experience a loss of about \$22,470,018.22 and \$32,308,584.32 by the year 2050 and 2100  
204 respectively.

205

#### 206 **4. Summary and Conclusion**

207 From the trend analysis, the yield decreased monotonically at a rate of 492.18 tonnes/yr  
208 ( $P < 0.05$ ). The increasing trend was established in annual rainfall trend. And there was a  
209 positive significant trend in maximum temperature, minimum temperature and mean  
210 temperature all at the rate of  $0.02\text{ }^{\circ}\text{C/yr}$  ( $P < 0.001$ ). The impact of climate change on the  
211 yield of cocoa in the study areas, there was a projected yield decrease of 9,334 and 9,379  
212 tonnes/yr by the year 2050 and 2100 respectively

213

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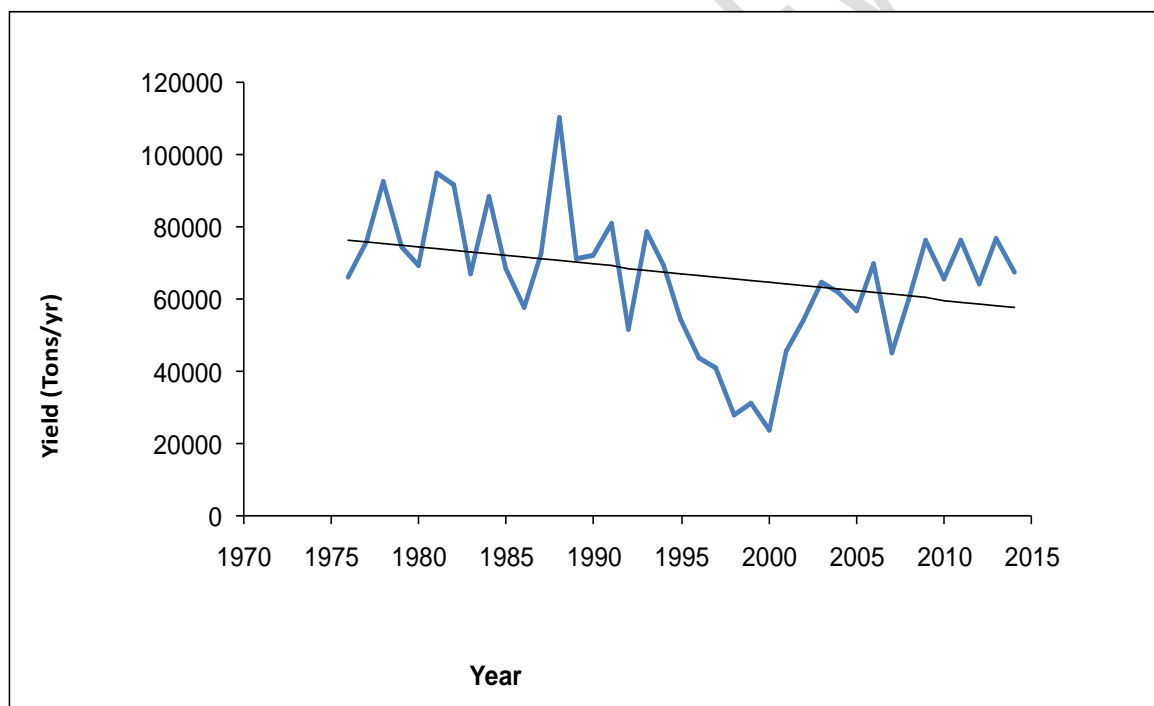
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254 **Table 1: Trends results of Annual Yield and climatic variables for Ondo State**

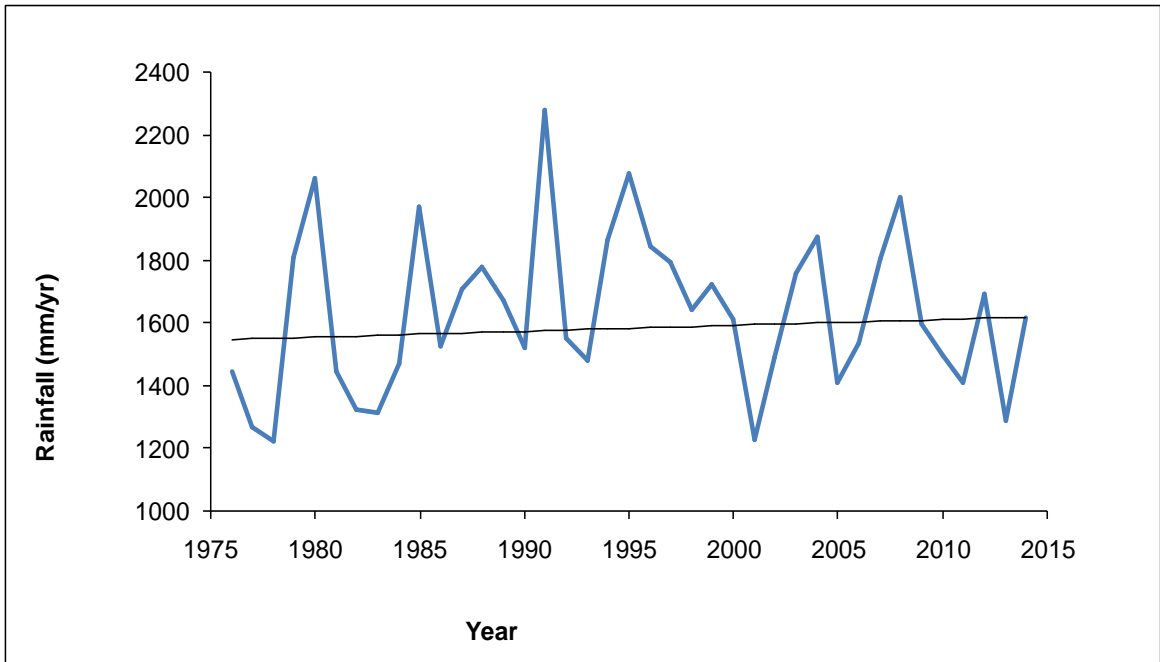
Time series	Test Z	Significance	Slope
Yield	-2.03	*	-492.18
Rainfall	0.53		1.88
Max. Temperature	4.15	***	0.02
Min. Temperature	4.09	***	0.02
Mean Temperature	4.61	***	0.02

255 \*\*\* Significant at 0.001, \*\*significant at 0.01, \* significant at 0.05, + significant at 0.1



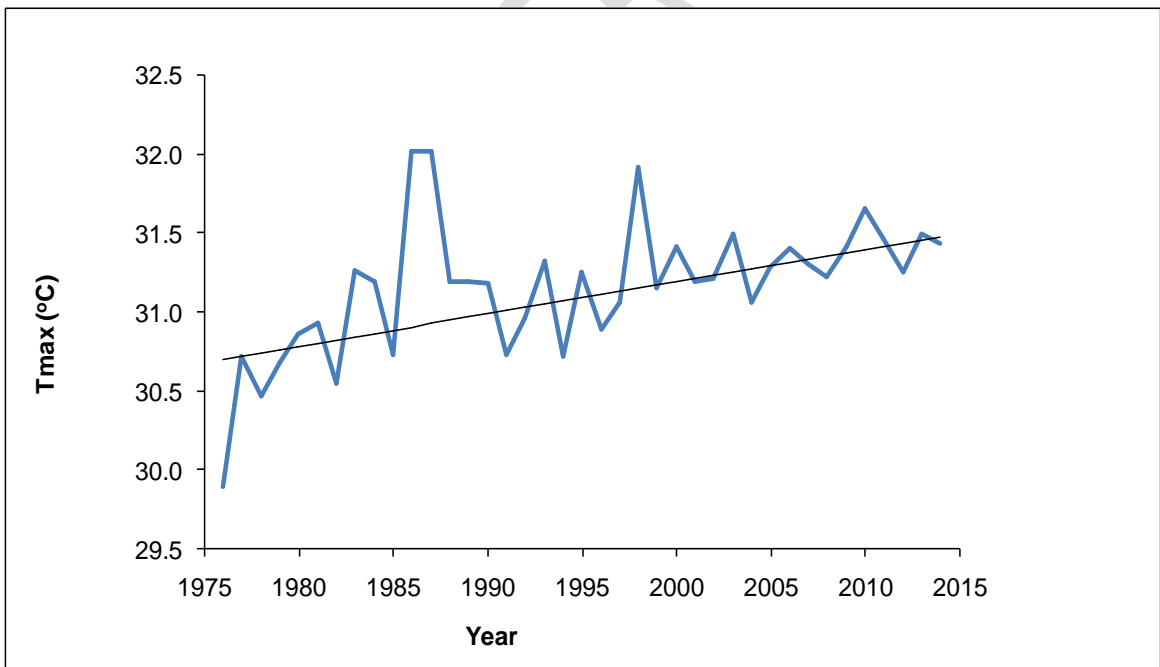
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257 **Figure 1: Annual trends in yield of cocoa between 1976 and 2014 in Ondo State**



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259 **Figure 2: Annual trends in rainfall between 1976 and 2014 in Ondo State**



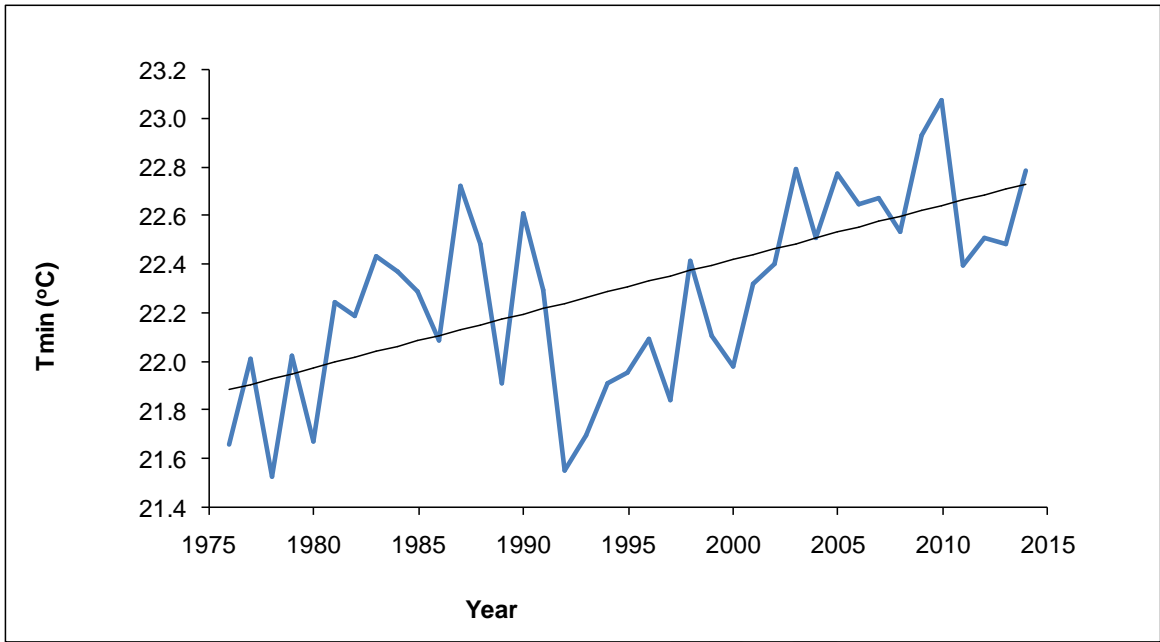
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262 **Figure 3: Annual Trends in Max. Temperature between 1976 and 2014 in Ondo**

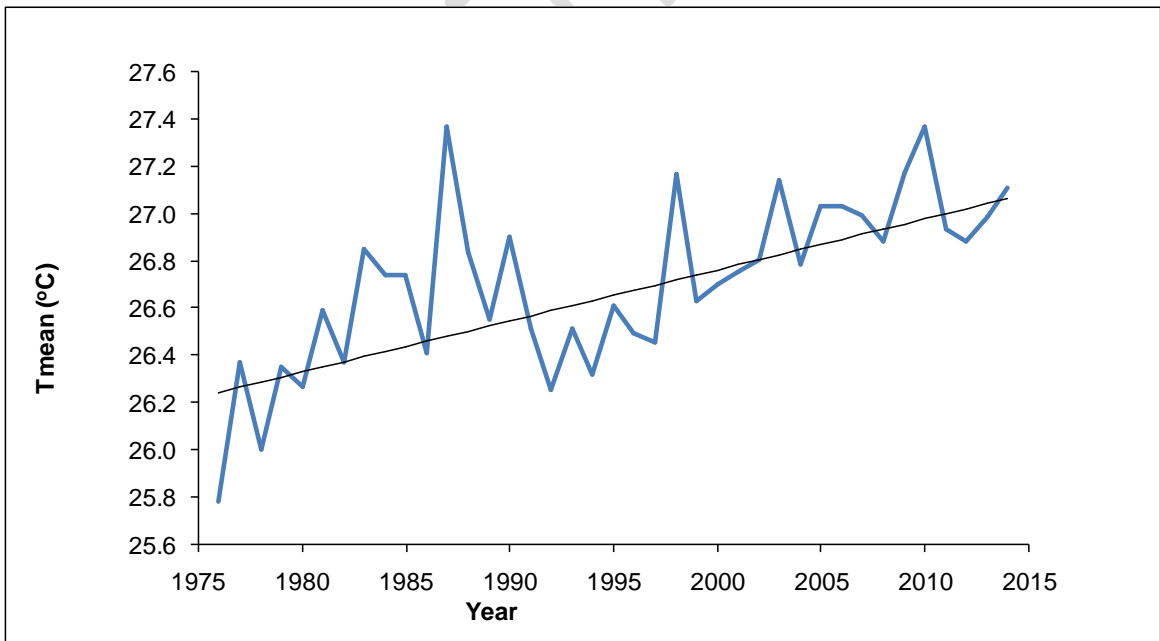
263 **State**

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265

266 **Figure 4: Annual trends in Min. temperature between 1976 and 2014 in Ondo State**



267

268 **Figure 5: Annual trends in mean temperature between 1976 and 2014 in Ondo State**



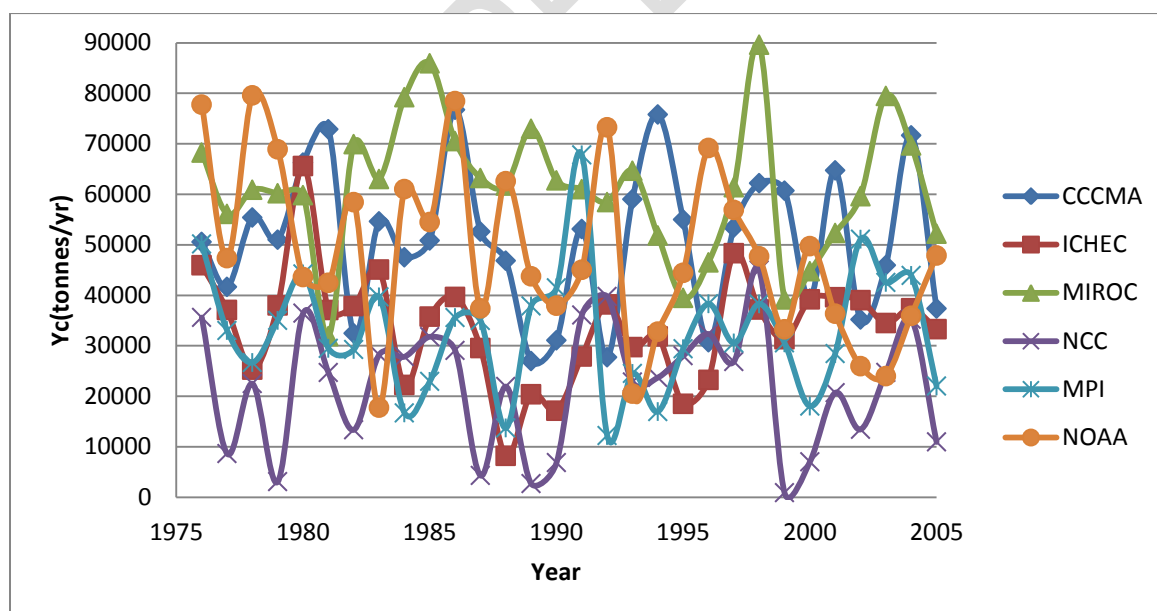
269 **Table 2: Summary of the stepwise regression between cocoa yield and the climatic**  
 270 **variables**

Models	States	Regression Model	R
i.	Ondo	$Y_c = \beta_0 + \beta_1 TY_{12} + e_i$	0.52
ii.	Ondo	$Y_c = \beta_0 + \beta_1 TY_{12} + \beta_2 R_6 + e_i$	0.68
iii.	Ondo	$Y_c = \beta_0 + \beta_1 TY_{12} + \beta_2 R_6 + \beta_3 TX_5 + e_i$	0.74
iv.	Ondo	$Y_c = \beta_0 + \beta_1 TY_{12} + \beta_2 R_6 + \beta_3 TX_5 + \beta_3 TZ_3 + e_i$	0.78

271

272 Where R = Correlation coefficient,  $Y_c$  = Yield,  $e_i$  = error term,  $\beta_0 - \beta_3$  are constant.  $R_1-R_{12}$   
 273 (Rainfall of January – December),  $R_{13}$  (Annual Rainfall);  $TY_1-TY_{12}$  (Max Temperature of  
 274 January – December),  $TY_{13}$  (Annual max temperature);  $TX_1-TX_{12}$  (Min. Temperature of January  
 275 – December),  $TX_{13}$  (Annual max temperature);  $TZ_1-TZ_{12}$  (Mean Temperature of January –  
 276 December),  $TZ_{13}$  (Annual mean temperature).

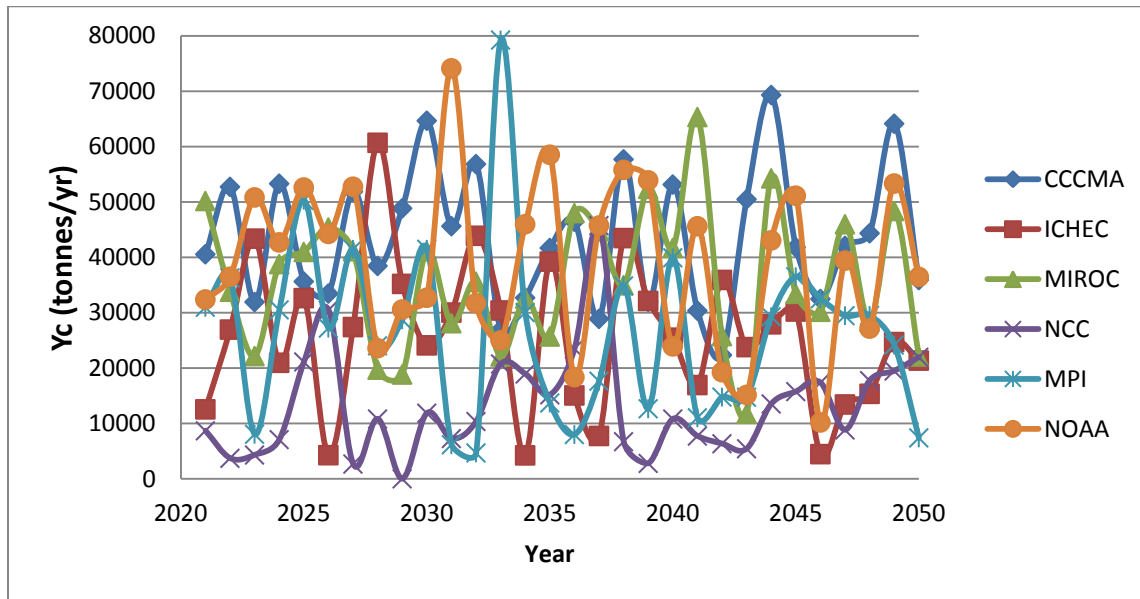
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279 **Figure 6: Present Day (1976 – 2005) cocoa yield in Ondo State**

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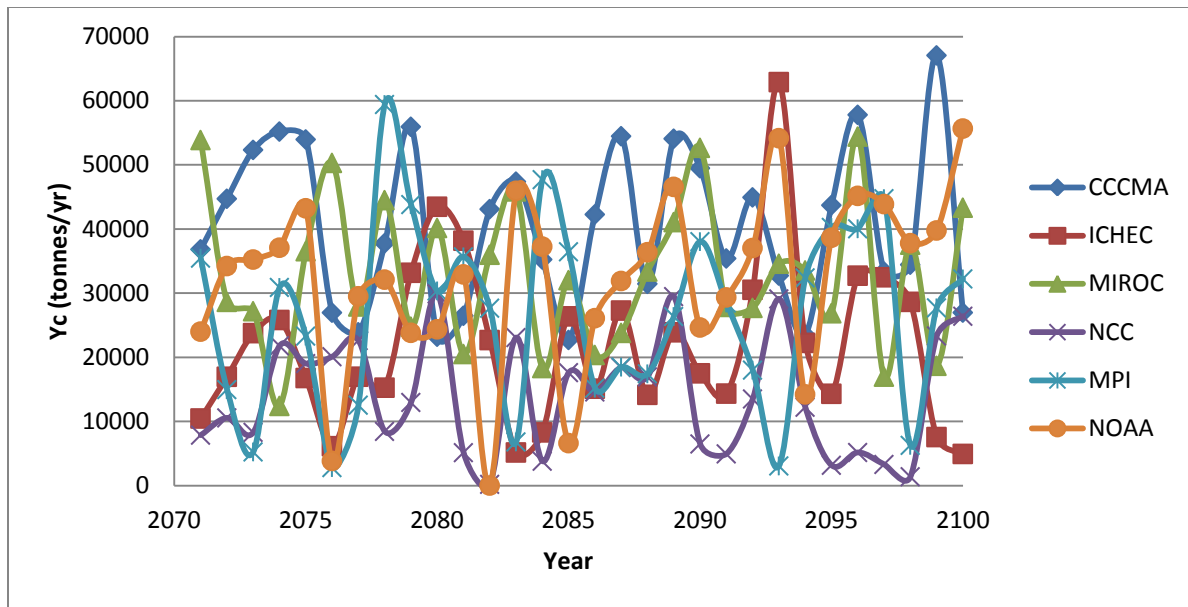
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282 **Figure 7: Projected Midterm (2021 – 2050) for different GCMs output based on RCP 4.5 in**

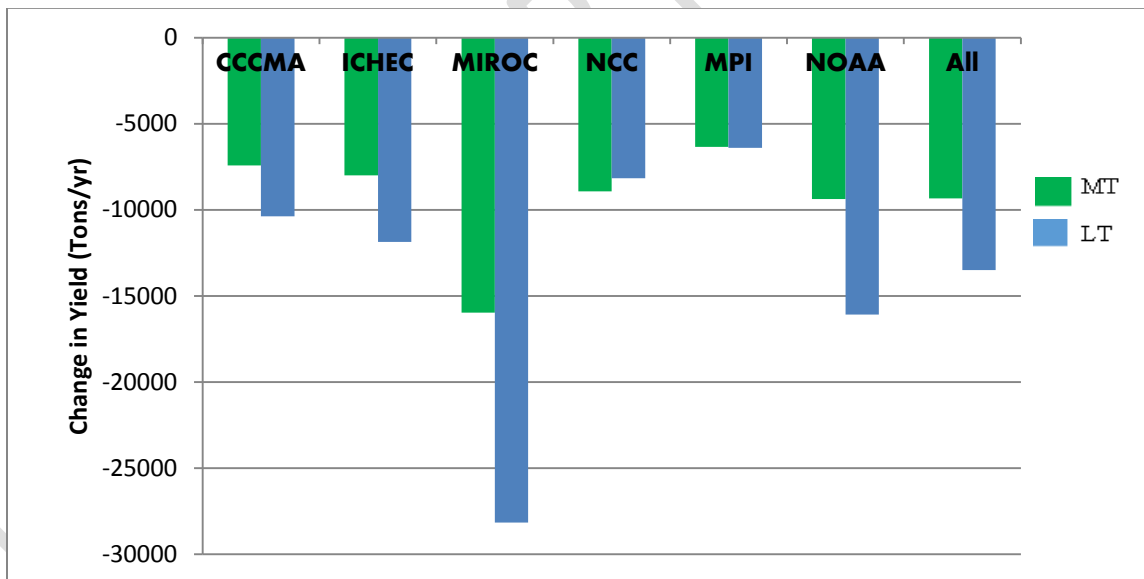
283 **Ondo State**

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 286 **Figure 8: Projected Long term future (2071-2100) yield for Six GCMs output based on**  
 287 **RCP 4.5**



288  
 289 **Figure 9: Change in yield of cocoa for the mid-term (MT; 2021-2050 in green) and long-**  
 290 **term (LT; 2071 -2100) in blue under RCP 4.5 emission scenario**

291

292

293 **Table 3: Descriptions of acronyms used for the study**

294	<b>Acronyms</b>	<b>Meaning of the Acronyms</b>
295	GCM	General Climate model / Global circulation model
296	RCP	Representative Concentration Pathways
297	IPCC	Intergovernmental Panel on Climate Change
298	IITA	International Institute of Tropical Agriculture
299	CRIN	Cocoa Research Institute
300	FAO	Food and Agricultural Organization
301	R	Correlation Coefficient
302	GHG	Green House Gases
303	CO <sub>2</sub>	Carbon dioxide
304	NPC	National Population Commission
305	CRU	Climate Research Unit
306	Tmax	Maximum Temperature
307	Tmin	Min Temperature
308	Tmean	Mean Temperature

309