

**IDENTIFYING CLIMATIC VARIABLES WITH
RICE YIELD RELATIONSHIP AND LAND COVER
CHANGE DETECTION AT SYLHET REGION**

ABSTRACT

The study was conducted to determine the correlation between climatic parameters and rice yield. The present study was also undertaken to analyze the land cover change in Sylhet districts between 2013 and 2018 using LANDSAT-8 images. Local climate and rice yield data were collected from BMD (Bangladesh Meteorological Department) and BRRRI (Bangladesh Rice Research Institute) and BBS (Bangladesh Bureau of Statistics). ArcGIS 10.5 and SPSS software were used to show the vegetation condition and correlation coefficient between rice yield and climatic variables respectively. It is revealed from the result that rainfall is negatively correlated with Aman and Boro (local and HYV) rice whereas temperature and relative humidity showed a positive correlation with local Aman and Boro rice. On the other hand, relative humidity showed a strong linear relationship with HYV Boro rice. Finally, both temperature and relative humidity have substantial effects on yields in the Boro rice. Furthermore, vegetation condition was observed through NDVI and found that maximum cultivation area was damaged due to a flash flood, flood and other climate-changing aspects like excessive rainfall and extreme temperature, etc. Additionally, Forested and high land vegetation's are endangered rapidly. Some adaptation strategies should be followed to minimize the effects of natural calamities for improving better vegetation condition.

Keywords: Climatic parameters, Rice yield, Landsat-8 satellite images, ArcGIS 10.5, NDVI

1. INTRODUCTION

Bangladesh is considered one of the countries that is most susceptible to climate change because of its location in the tropics, the supremacy of floodplains, its low elevation from sea level, its high population density and its little economic and technological capacity [1-5]. Because of growing emissions of anthropogenic greenhouse gases through human activities, climate change has arisen as a key concern for environmentally and economically vulnerable countries, such as Bangladesh. Combined with the possible increase in global temperature, rainfall has already become inconstant and erratic, and the incidence and strength of climate related extreme events, such as floods, droughts, heat waves, and cyclones, are projected to increase in the future [6-9].

Bangladesh is the sixth biggest rice-producer country in the world. In the last three to four decades, great efforts in rice research and agricultural innovations were made to increase rice production, and it has increased to about 48 million tons in 2009 from about 17 million tons in 1970. The country is also said to have amongst the highest per capita ingesting of rice (about 170 kg annually), and its food safety and economy largely depend on good production of rice [10]. The percentage share of rice in value is more than 60% of the total crop agriculture [9,11]. Furthermore, agriculture accounts for nearly 20% of gross domestic

33 product (GDP), and almost 66% of the labor force depends on agriculture for employment
34 [12].

35 Even though the success in rice production, the country still appearances many challenges
36 in the agricultural sector because of predict climate change impacts and always growing
37 population. Effects like temperature rise, unpredictable rainfall, ambiguous environment as
38 well as great climatic events like frequent cyclones, prolonged flood, sea level rise and
39 others, are already being felt in Bangladesh.

40 Temperatures in Bangladesh have been increasing, mainly during the monsoon season, for
41 the last three decades [13]. Additionally, the country is predicted to experience a rise in
42 average day temperatures of 1.0 C by 2030 and of 1.4 C by 2050 [6-7]. Rainfall has become
43 increasingly adjustable and has verified an uneven distribution. The number of days without
44 rain is increasing, although the total annual rainfall essentially remains the same. This erratic
45 pattern produces extreme events, such as floods and drought, which have noticeable hostile
46 effects on rice yields [14]. As a result, rice production is likely to decline by 8–17% by 2050
47 [7,10]. Sylhet is one of the most affected areas in Bangladesh due to the threats of climate
48 change effects. Sylhet is located in the active monsoon areas with an average rainfall of
49 around 3963 mm each year [15]. So far, the rainfall distribution isn't uniform steadily. The
50 rainy season from April to October is hot and humid with very heavy showers and
51 thunderstorms almost every day, whereas the short dry season from November to February
52 is very warm and fairly clear [16]. Rainfall varies not only with time but also with geographical
53 area and altitude in space and is a continuous random variable [17].

54 The land use/land cover pattern of a region is an outcome of natural and socio – economic
55 factors and their utilization by man in time and space. Hereafter, information on land use /
56 land cover is important for the assortment, planning and implementation of land use and can
57 be used to meet the swelling demands for basic human needs and welfare. This information
58 also assistances in monitoring the dynamics of land use resulting out of changing demands
59 of increasing population.

60 Land use of Sylhet has progressively changed. This is found from the field survey that in
61 1970 the area was dominated by marshy land (645.33 katha), vacant land (430.88 katha)
62 and crop land (336.17 katha). By 1988 there was no university in the area. Residential area
63 also increased, it covered 39.11% of total study area. Now in 2007 there is a radical change
64 noticed in the area in comparison with 1988. Population has increased and consequently
65 residential area has also increased. Now it covers 58.71% of the study area. It was stated
66 that water bodies of Sylhet district were 81535.2 ha, 34535.7 ha and 28435.6 ha in
67 1988,1997 and 2006 respectively and unplanned urbanization played the key role in
68 reduction in water bodies [18]. The impacts of land use changes are desertification, climate
69 changes and hill cutting. Inappropriate lands use like removal of vegetal cover carries about
70 marked changes in the local climate of Sylhet. Deforestation changes rainfall, temperature,
71 wind speed etc. It was observed that rainfall pattern, atmospheric window of Sylhet has been
72 rehabilitated significantly within ten years. Considering this, the following objectives are; to
73 correlate between climatic variables and rice yield. And to detect the land cover change
74 through landsat-8 satellite image.

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77 **2. MATERIAL AND METHODS**

78 **2.1 Study area**

79 The study area lies in latitude 24°89 N and longitude 91°86 E. The total area of the Sylhet is
80 12298.4 km square. Density of the area is 980/km-square. Average rainfall of area is around
81 3876 mm and relative humidity is 74%.

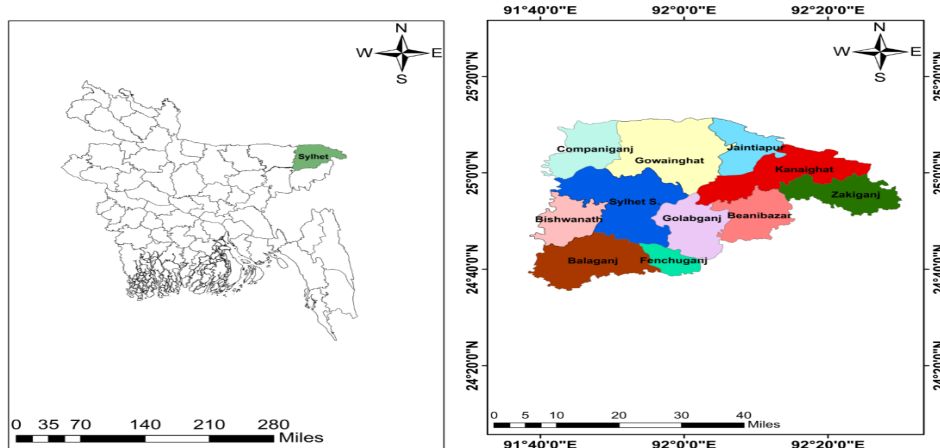


Fig. 1: Map of the study area

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2.2 Methodology:

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2.2.1 Time series data and its sources

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The climate data on daily temperature, rainfall and relative humidity for the 1970–2017 period was collected from the secondary sources of Bangladesh Meteorological Department (BMD) for Sylhet district weather station. The climate data converted to seasonal average data according to the growing periods of the three major rice varieties (Aus, Aman, and Boro). Then the data were processed for the following two growing seasons [19].

86

•Aman Growing Season (June–November): Production of this season is overwhelmed by the regular intensive rainfall of monsoon, highly humid weather and cloudiness.

87

•Boro Growing Season (December–may): This season is depicted as the driest and sunniest time of the year comprises of the long periods of winter and pre-monsoon summer.

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2.2.2 Panel data and their sources

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Data on the rice yields of the two major varieties of rice in Bangladesh (Aman, and Boro) in the time span (1970–2017) were gathered from the Yearbook of Agricultural Statistics of Bangladesh published by the Bangladesh Bureau of Statistics (BBS), Department of Agricultural Extension (DAE) also BRR (Bangladesh Rice Research Institute). The rice yield data (measured in Metric tons per acre [M.ton/acre]) include the time series average crop yields for rice growing district. Yield data were found as the fiscal year basis, such as 1971–1972, 1972–1973, etc. Then, these fiscal year data were transformed into yearly data, for example, 1971–1972 was considered as 1972.

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2.2.3 Satellite images acquired and source

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For the present study, landsat-8 satellite images of Sylhet district were acquired for six years namely 2013, 2014, 2015, 2016, 2017 and 2018 by using earth explorer. All the images have been taken for different month of each year. All the LANDSAT images have been taken from <https://earthexplorer.usgs.gov/>. and having resolution of 30 meters of each.

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2.2.4 NDVI analysis process:

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- Landsat 8 images download
- ArcGIS 10.5 (Atmospheric Correction)
- NDVI
- Clipping of NIR & RED with shapefile and NDVI creation
- NDVI classification
- Determination of area

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NDVI is calculated on a per-pixel basis as the normalized difference between the red and near infrared bands from an image:

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$$NDVI = \frac{NIR - RED}{NIR + RED}$$

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119 where NIR is the near infrared band value for a cell and RED is the red band value for the
 120 cell. The wavelength for Band 4 (RED) and Band 5 (NIR) are 0.636-0.673 and 0.851-0.879
 121 respectively

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123 3. RESULTS AND DISCUSSIONS

124 The summary statistics of all the numerical climate data series used in this study are
 125 presented in table

126 **Table 1: Summary statistics of the data series for the period 1970–2017**

127

Variables	Rice Varieties	Statistics						
		Mean	Median	Max.	Min.	Std. Dev.	Skewness	Kurtosis
Local Variety-Yield (M.tons)	Aman	12.33	12.51	12.87	11.32	0.41	-1.23	0.60
	Boro	11.88	12.24	12.96	9.50	0.89	-1.29	0.47
HYV-Yield(M.tons)	Aman	11.49	11.94	12.97	6.49	1.27	-1.57	3.62
	Boro	12.13	12.02	13.44	9.68	0.75	-0.42	1.14
Rainfall (mm)	Aman	2.40	2.42	2.74	2.05	0.14	-0.23	0.23
	Boro	2.18	2.19	2.47	1.81	0.15	-0.31	-0.50
Avg. temp.°C	Aman	3.45	3.46	3.60	3.26	0.09	-0.35	-0.91
	Boro	3.17	3.20	3.31	2.93	0.10	-0.72	-0.37
Relative Humidity (%)	Aman	4.40	4.43	4.51	4.19	0.08	-1.23	0.45
	Boro	4.14	4.16	4.25	3.93	0.07	-1.21	0.74

128

129 It is obvious from the table that yield of Aman rice for local variety is the highest compared to
 130 Boro rice. On the other hand, for HYV Boro rice is the highest mean yield. In the case of
 131 climatic variables, the lowest mean seasonal rainfall for Boro growing period. In contrast the
 132 highest avg. temperature is observed for Aman growing period and lowest Avg. temperature
 133 is found for Boro growing period. Though, in the case of relative humidity the maximum
 134 percentage of humidity is perceived in Aman growing season, whereas Boro growing season
 135 is detected the lowest percentage.

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137 3.1 CORRELATION COEFFICIENTS BETWEEN RICE YIELD AND CLIMATIC 138 PARAMETERS

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140 The bivariate Pearson Correlation produces a simple correlation coefficient, r , which
 141 measures the strength and direction of linear relationships between pairs of continuous
 142 variables. A scatterplot is a type of data display that displays the relationship between two
 143 variables.

144 The mathematical formula of linear correlation coefficient of Pearson product moment
 145 method is,

$$r = \frac{n\sum xy - (\sum x)(\sum y)}{\sqrt{[n\sum x^2 - (\sum x)^2][n\sum y^2 - (\sum y)^2]}}$$

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Which can be written as,

$$r = \frac{s_{xy}}{\sqrt{(s_x)(s_y)}}$$

147

148 Where X and Y are n paired observations,

$$s_{xy} = \sum(x_i - \bar{x})(y_i - \bar{y})$$

$$s_x = \sum(x_i - \bar{x})^2$$

$$s_y = \sum(y_i - \bar{y})^2$$

149

150 Requirements for Pearson's correlation coefficient:

- 151 ➤ Scale of measurement should be interval or ratio.
- 152 ➤ Variables should be approximately normally distributed.
- 153 ➤ The association should be linear.
- 154 ➤ There should be no outliers in the data.

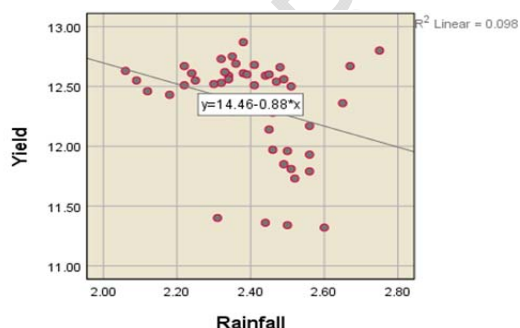
155 **3.1.1 Interpretation of coefficient of correlation:** Coefficient of correlation denoted by r is
156 the degree of correlation between two variables. The value of r always lies between -1 and
157 +1.

- 158 ✓ When r is 1, we say there is a perfect positive correlation. A value of the coefficient
159 close to +1 indicates a strong positive linear relationship.
- 160 ✓ When r is a value between 0 and 1, we say there is a positive correlation.
- 161 ✓ When r is 0, we say there is no correlation. A correlation of zero means there is no
162 relationship between the two variables. A value close to 0 indicates no linear
163 relationship.
- 164 ✓ When r is a value between -1 and 0, we say that there is a negative correlation.
- 165 ✓ When r is -1, we say there is perfect negative correlation. A value close to -1
166 indicates a strong negative linear relationship [20].

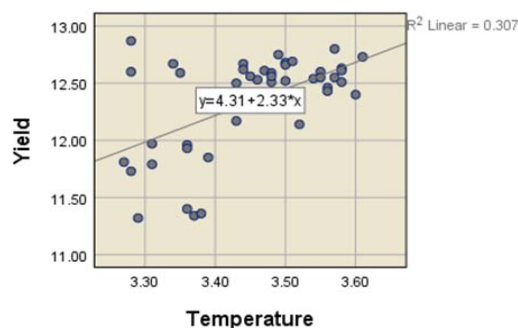
167 **3.1.2 Local Aman rice variety**

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171 **Fig. 2: Yield vs rainfall**



172 **Fig. 3: Yield vs temperature**

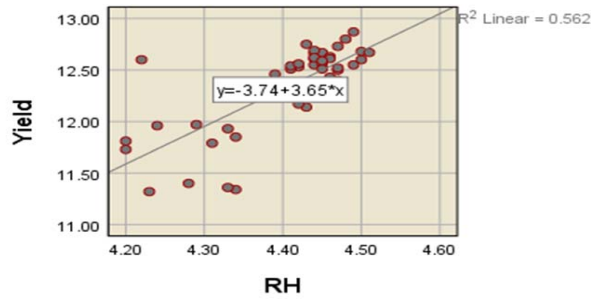


Fig. 4: Yield vs relative humidity

From figure (2-4), It can be perceived from the scatter plot that the points are reasonably closely scattered about an underlying straight line so there is a strong linear relationship between the two variables (yield vs temperature, yield vs RH). The correlation analysis showed that rainfall is negatively correlated with Aman and showed a weak relationship.

3.1.3 HYV (high yielding variety) Aman Rice

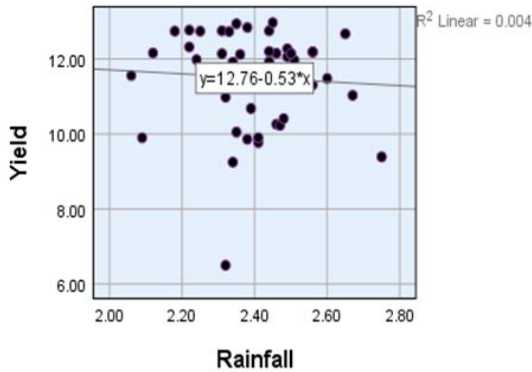


Fig. 5: Yield vs rainfall

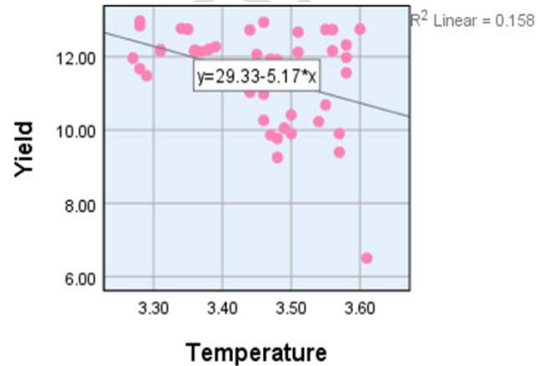


Fig. 6: Yield vs temperature

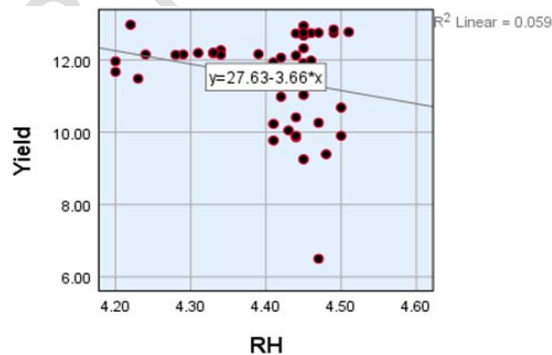


Fig. 7: Yield vs relative humidity

From figure (5-7) showed that the line drawn through the parameters were a negative slope, so this scatterplot is a negative linear correlation. The value of R² for all parameters indicated that the co-relation between the variables is not well enough. The slope of the line is very negligible which indicated that yield has very little dependency on the climatic parameters.

3.1.4 Local Boro Rice

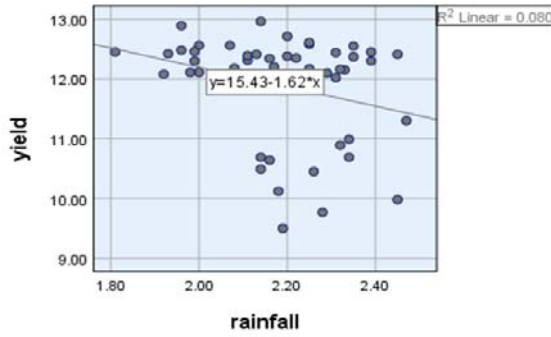


Fig. 8: Yield vs rainfall

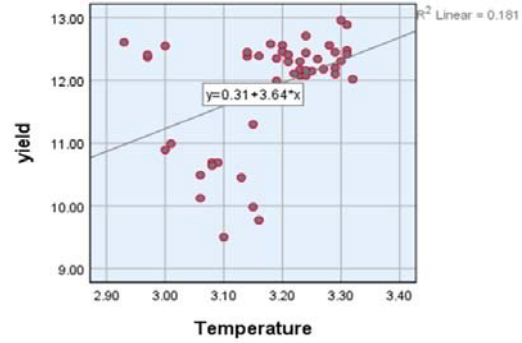


Fig. 9: Yield vs temperature

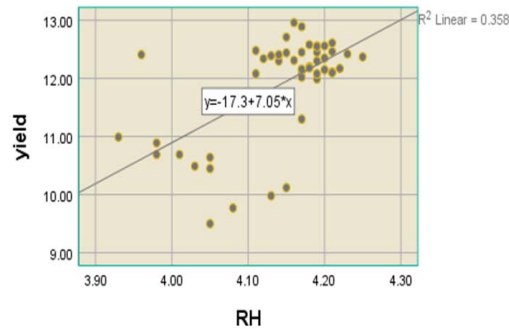


Fig. 10: Yield vs relative humidity

From figure (8-10), it is predicted that rainfall shows a weak correlation between yield. The strong linear relationship between the temperature, relative humidity and yield is also found from co-relation coefficients. The value of R^2 for temperature and relative humidity indicated that the co-relation between the variables is well enough. The slope of the line is moderate which indicated that yield has a good dependency on the climatic parameters.

3.1.5 HYV (High yielding variety) Boro Rice

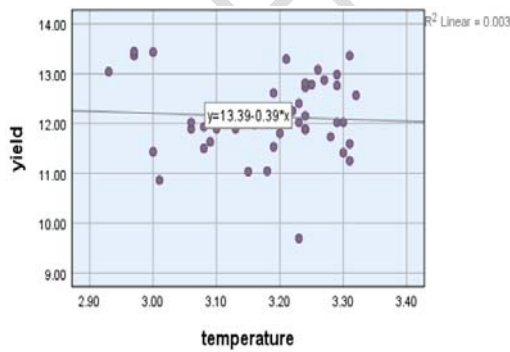


Fig. 11: Yield vs temperature

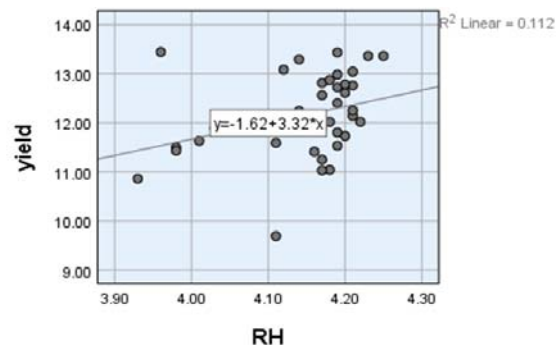


Fig. 12: Yield vs relative humidity

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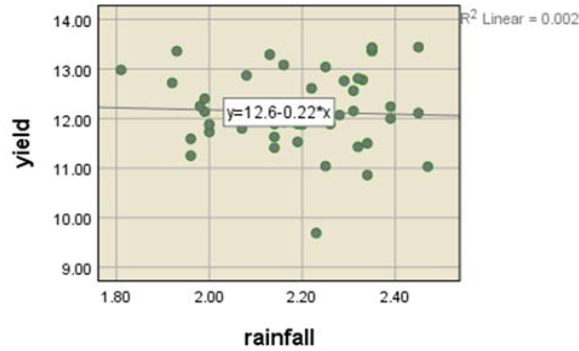


Fig. 13: Yield vs rainfall

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From figure (11-13), it is predicted that for HYV Boro, rainfall and temperature show a weak correlation between yield. However, relative humidity shows a positive linear.

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3.2 LAND COVER CHANGE DETECTION

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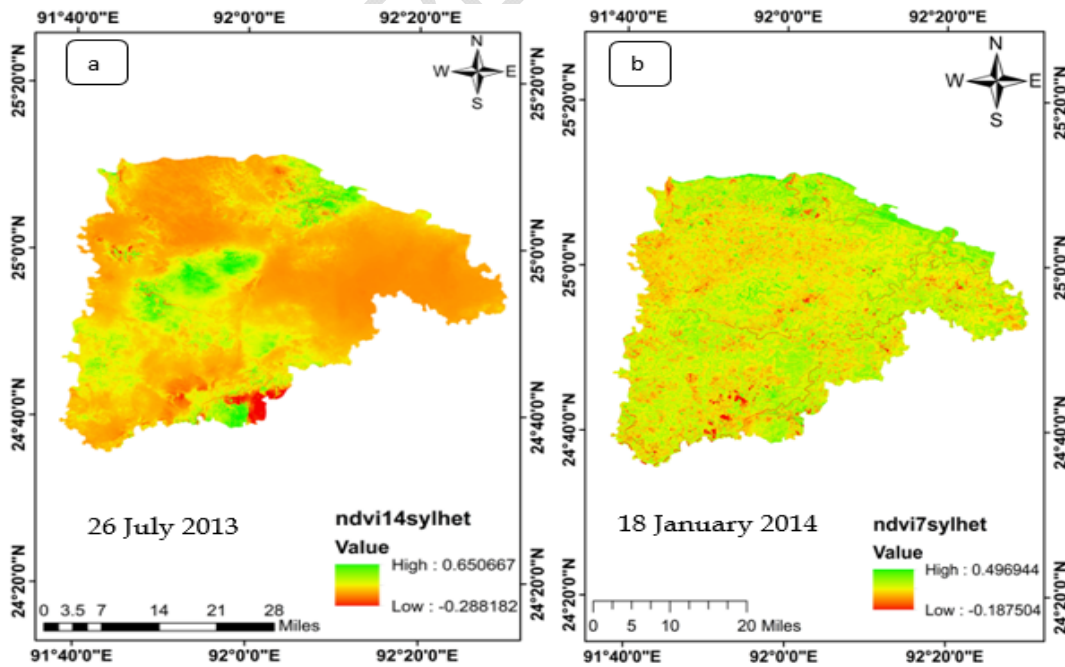
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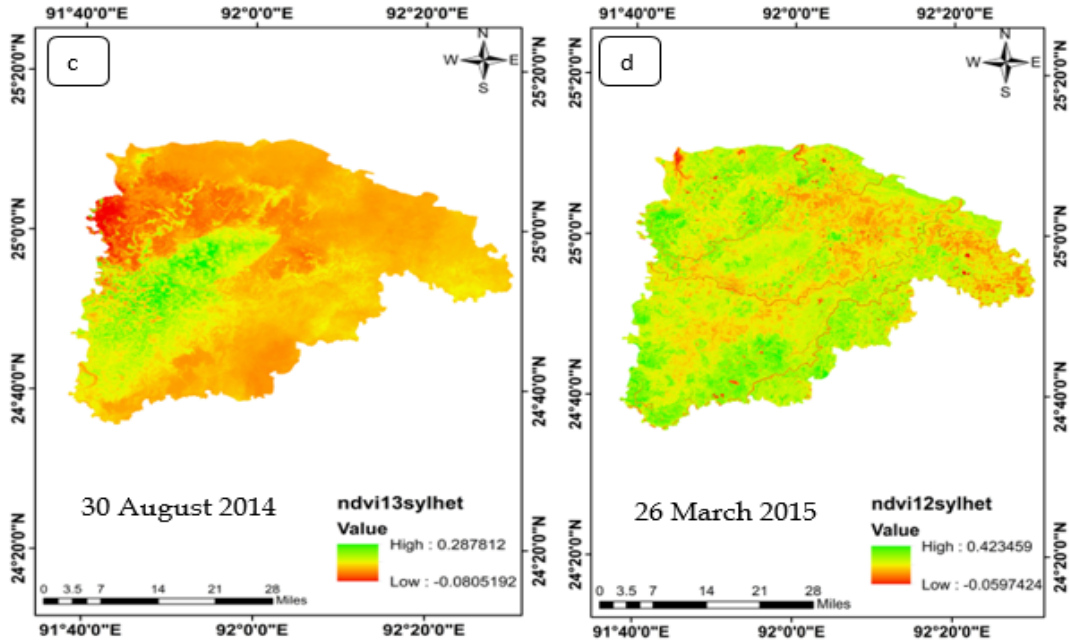
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Land cover change detection is measured by “Vegetation Index Differencing (NDVI)”. The use of the Normalized Difference Vegetation Index (NDVI) is applied to detect areas of forest cover change and different year wise NDVI derived quantitative data are generated and summarized using remote sensing, GIS software and spreadsheet. The NDVI is the most common measurement used for measuring vegetation cover. It ranges from values -1 to +1. Red color indicates (-0.1 and below) correspond to barren areas of rock, sand, or urban/built-up. Dark red color represents Zero that indicates the water cover. Yellow represent low density of vegetation (0.1 to 0.3), while high values of green color indicate vegetation (0.4 to 0.8). Some NDVI maps using Landsat 8 Satellite Imageries (2013-2018) are given below;



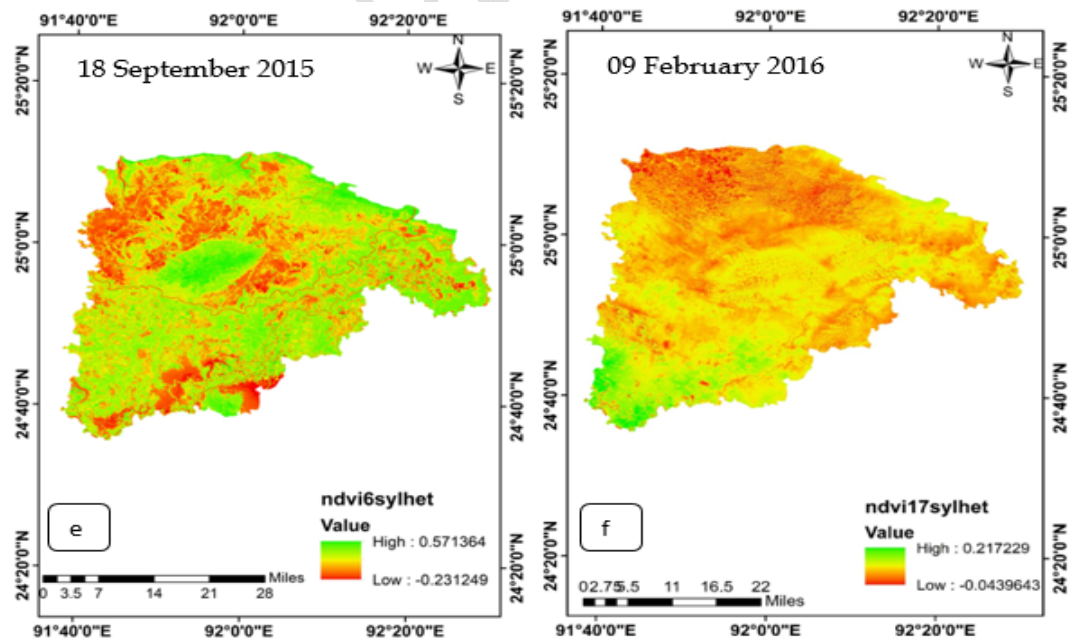
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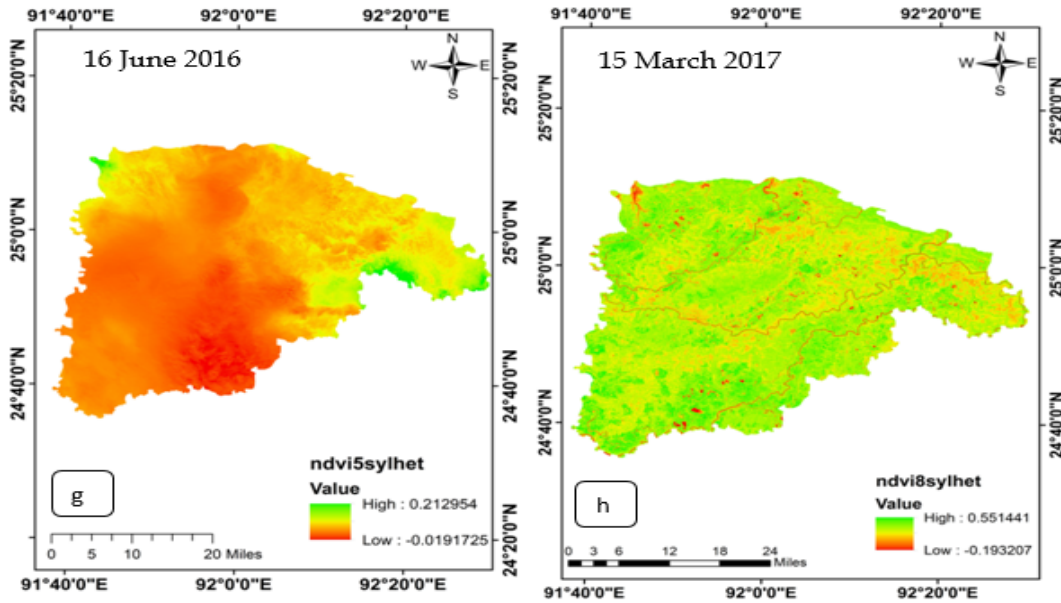
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232 **Fig. 14(a-d): NDVI derived classified map of Study area for different years (2013-2015)**

233 From figure 14(a-d), highest NDVI value is found in 2013 (0.65) which denotes presence of
 234 moderate-high vegetation cover at that time period. After 2013, highest NDVI value is found
 235 following a decreasing trend which clearly represents the rapid vegetation cover change in
 236 the study area. During the period of 2015 march, NDVI value represents the highest value is
 237 0.4234 that means most cultivation area is suitable for better yield/ cultivation.



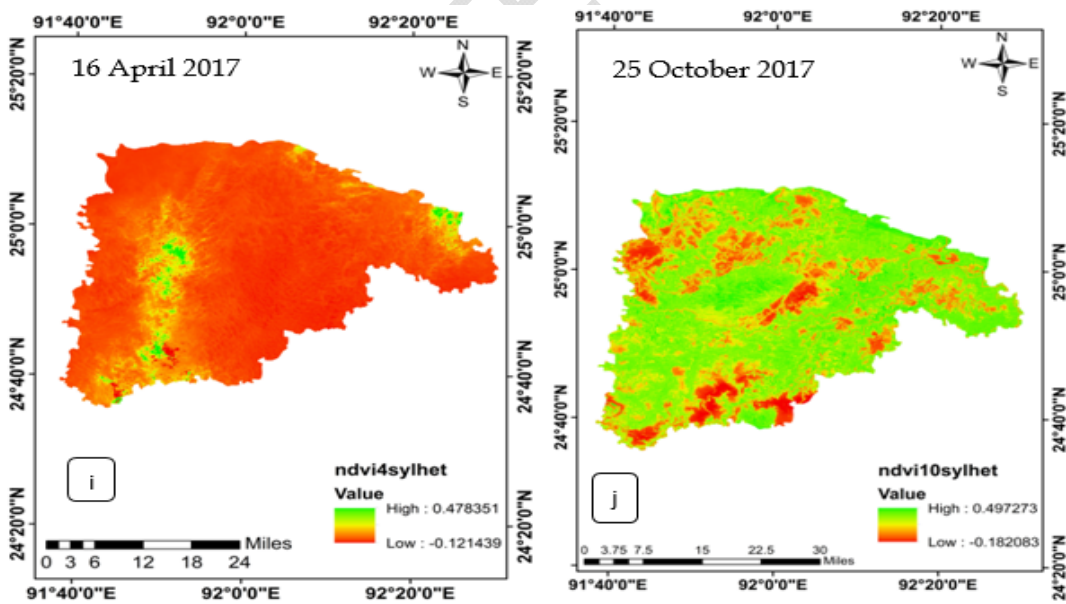
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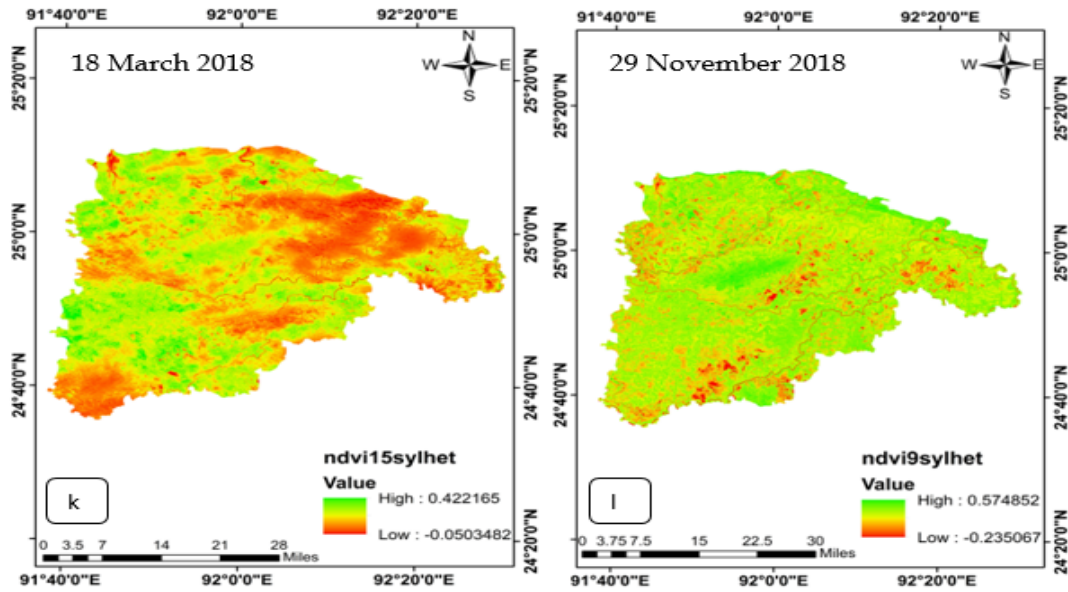
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240 **Fig. 15(e-h): NDVI derived classified map of Study area for different years (2015-2017)**

241 From figure 15(e-h) stated that, In the year 2016, most of the areas represent shrub and
 242 grassland while maximum temperate and tropical rainforests areas are found in 15 march
 243 2017.



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246 **Fig. 16 (i-l): NDVI derived classified map of Study area for different years (201-2018)**

247 The devastating flash flood in 27 March 2017 caused an enormous impact on the vegetation
 248 coverage which is described above in NDVI maps. After the flash flood of 16th April 2017,
 249 NDVI map described that vegetation field was totally damaged for cultivation and all of the
 250 areas are full of rock, sand or snow. During March 2018, the NDVI results showed that
 251 maximum areas were full of low-density vegetation whereas November 2018 described high
 252 vegetation area for cultivation of crops.

253 **3.4 PROPER MANAGEMENT APPROACH**

254 Land use is obviously inhibited by environmental factors such as soil characteristics, climate
 255 change, topography, vegetation etc. In contrast, land cover change means the loss of natural
 256 areas.

257

- 258 ➤ The divergence of crop agriculture is a crucial method in addressing climate change
 259 but requires research on suitable varieties for the new physical, social and climatic
 260 situations.
- 261 ➤ High-temperature and excessive rainfall stresses can be avoided by changing the
 262 transplanting date or growth period.
- 263 ➤ Developing competent and high-intensity cropping systems and compatible agro-
 264 techniques also understanding crop-weather relationships that serve as basis for
 265 preparing crop weather production models [21].
- 266 ➤ The introduction of water-saving technology in rice production is an efficient method
 267 to keep the underground water table in a safe zone. Instead of flood irrigation,
 268 alternate wetting and drying (AWD) methods of irrigation can be used.
- 269 ➤ Established of seed banks to confirm that varieties remain accessible in disaster
 270 periods.
- 271 ➤ To avoid vegetation degradation the thrust of research should be in the following
 272 areas- i) inventory of soil resources at thana level, ii) preparation of thematic maps
 273 for land use planning, iii) soil degradation assessment, iv) developing a long-term
 274 climatic data base and v) database for surface and ground water resources [21].

- 275 > Documentation, motivation, training in order to concern about the impacts of natural
276 calamities and adaptive technologies by the farmers. Finally, government should take
277 some faithful steps.

278 **4. CONCLUSION**

279 The objective of this study was to estimate the relationship between rice yields and climate
280 variables using time series data. The overall findings expose that three climate variables
281 have significant effects on the rice yield. The correlation coefficients varied according to
282 seasons. However, Rainfall, temperature and relative humidity are found to be negatively
283 related to HYV Aman rice yield. Moreover, Maximum temperatures and relative humidity
284 have positive effects on local Boro yield, whereas rainfall affect yields negatively. One
285 fascinating finding is that rainfall is insignificant for all yields, this result supports the fact that
286 these varieties do not grow well in excessive rain-fed conditions. On the other hand, there
287 was a change of vegetation condition during the pre-monsoon, monsoon and post-monsoon
288 period from 2013 to 2018. The number of agricultural lands and water bodies have been
289 decreased. Due to the flash flood in march 2017, the maximum vegetation areas were
290 damaged and pre-flash flood and post flash flood vegetation condition was also identified in
291 this research. As such, the rice crop can be harvested preceding to the beginning of the
292 flash flooding season that is usually common in the month of April. Another option is that
293 analysis of climatic conditions, particularly temperature and rainfall regimes, to minimize the
294 negative effects of climate change and improving better production. In the future, other
295 climatic parameters like evaporation rate, cloud, wind velocity, vapor pressure, soil type, and
296 soil moisture may be considered. For further land cover change detection study is needed to
297 examine the historical data with new methods, tools, and data resources in the context of
298 environmental change at the national and local scale.

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300 **COMPETING INTERESTS**

301 Authors have declared that no competing interests exist.
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304 **REFERENCES**

- 305 1. MOEF (Ministry of Environment and Forest), 2005: National Adaptation Program of
306 Action (NAPA). Government of Bangladesh, Dhaka.
- 307 2. DOE (Department of Environment), 2007: Climate Change and Bangladesh. Ministry
308 of Environment and Forest, Government of Bangladesh.
- 309 3. Shahid S, Behrawan H, 2008: Drought risk assessment in the western part of
310 Bangladesh. Nat. Hazard 46, 391–413.
- 311 4. Pouliotte J, Smit B, Westerhoff L, 2009: Adaptation and development: livelihoods
312 and climate change in Subarnabad, Bangladesh. Clim. Develop. 1, 31–46.
- 313 5. Huq S, Rabbani G, 2011: Climate change and Bangladesh: policy and institutional
314 development to reduce vulnerability. J. Bangladesh Stud. 13, 1–10.
- 315 6. FAO (Food and Agriculture Organization), 2006: Livelihood adaptation to climate
316 variability and changes in drought-prone areas of Bangladesh, Rome, Italy.
- 317 7. IPCC (Intergovernmental Panel on Climate Change), 2007, Climate Change 2007:
318 impacts, adaptation and vulnerability: contribution of Working Group II to the fourth
319 assessment report of the Intergovernmental Panel on Climate Change. Cambridge
320 University Press, Cambridge, UK.
- 321 8. Ahsan S, Ali M S, Hoque M R, Osman MS, Rahman M, Babar MJ, Begum SA,
322 Rahman D M, Islam KR, 2011: Agricultural and environmental changes in
323 Bangladesh in response to global warming. In: Lal, R., Sivakumar, M.V.K., Faiz,

- 324 S.M.A., Rahman, A.H.M.M., Islam, K.R. (Eds.), *Climate Change and Food Security*
325 *in South Asia*. Springer, Netherlands, pp. 119–134.
- 326 9. Yu WH, Alam M, Hassan A, Khan AS, Ruane AC, Rosenzweig C, Major DC,
327 Thurlow J, 2010: *Climate Change Risk and Food Security in Bangladesh*.
328 EarthScan, London.
- 329 10. BBS (Bangladesh Bureau of Statistics), 1972-2002: *Statistical Year Book of*
330 *Bangladesh*. Stat. Div. Minis. Planning Govt. People's Repub. Bangladesh.
- 331 11. Asaduzzaman, M, Ringler C, Thurlow J, Alam S, 2010: *Investing in Crop*
332 *Agriculture in Bangladesh for Higher Growth and Productivity, and Adaptation to*
333 *Climate Change*. Bangladesh Food Security Investment Forum, Dhaka.
- 334 12. GOB (Government of Bangladesh), 2010: *Bangladesh Economic Review*. Ministry
335 of Finance, Dhaka, Bangladesh.
- 336 13. UNDP (United Nations Development Program), 2008. *Fighting Climate Change:*
337 *Human Solidarity in a Divided World*. Human Development Report.
- 338 14. Alauddin M, Hossain M, 2001: *Environment and Agriculture in a Developing*
339 *Economy: Problems and Prospects for Bangladesh*. Edward Elgar, London.
- 340 15. Bari S H, Rahman M T, Hussain M M, and Ray S, 2015: *Forecasting monthly*
341 *precipitation in Sylhet city using ARIMA model*. *Civil and Environmental Research*,
342 7(1), 69-77.
- 343 16. Wikipedia, 2009: *Monthly Averages for Sylhet*, BGD MSN Weather. Retrieved 25
344 May
- 345 17. Ali M M, Talukder M S U, Hossain M G and Hye M A, 1994: *Rainfall features and*
346 *effect of extreme events on statistical parameters off rainfall at Mymensingh*.
347 *Bangladesh J. Agril. Sci.* 21(1): 157-165.
- 348 18. Banglapedia, 2010: *Bangladesh Population Census 2001*, Bangladesh Bureau of
349 Statistics; *Field report of Sylhet District 2010*; *Field report of different upazillas of*
350 *Sylhet District 2010*.
- 351 19. Sarker M, and Rashid A, 2012: *Impacts of climate change on rice production and*
352 *farmers' adaptation in Bangladesh* (Doctoral dissertation, University of Southern
353 Queensland).
- 354 20. Hasan M, 2017: *Relationship between Monsoon Rainfall and Winter Minimum*
355 *Temperature over Bangladesh* (Doctoral dissertation, Khulna University of
356 Engineering & Technology (KUET), Khulna, Bangladesh.).
- 357 21. DL Deb, 'Excellence in research in the agricultural sciences in relation to food and
358 environmental security', *Journal of Higher Education*, 17(1), 1994: SM Saheed,
359 *Country Report Bangladesh, Expert Consultation of the Asian Network on Problem*
360 *Soil*, FAO, Manila, 1995.
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362
363
364
365
366