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Atmospheric CH₄ Dynamics of South-West Bangladesh: A Google Earth Engine-Based Remote Sensing Approach

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Abstract

A severe contributor to global warming, Methane (CH₄) is a significant element of Green House Gases (GHGs). Both anthropogenic and natural sources are responsible for its emission. The development of satellites for remote sensing has made it convenient to study the spatiotemporal distribution of any gaseous component. Tropospheric Monitoring Instrument (TROPOMI) integrated with Sentinel-5 Precursor (Sentinel-5P) satellite is proven efficient in studying CH₄. Sentinel-5P TROPOMI CH₄ data from February 2019 to September 2022 has been used to research southwest districts with the Sundarbans mangrove forest. Besides, satellite data from MODIS (Moderate Resolution Imaging Spectroradiometer), ERA5 and Climate Hazards Group Infrared Precipitation with Station data (CHIRPS) are used to analyse methane changes from 2019 to 2022. All these diverse datasets have been retrieved by using Google Earth Engine (GEE) platform. CH₄ emission shows an increasing trend over the study area. The emission rate is higher (more than 1900 to 1950 ppb) in all districts during the dry winter season, especially from January to March. Particularly, cropland and water have regular and higher emissions. On the contrary, bare ground and rangeland have irregular and higher emissions. Built area exerts higher emission trend (more than 1900 ppb) in Satkhira district. All districts, including the Sundarbans, have shown positive relation with Normalized Difference Vegetation Index (NDVI) and Normalized Difference Water Index (NDWI),

indicating single cropland and shrimp aquaculture as significant emitters. The presence of massive vegetation and waterbodies in the Sundarbans is responsible for low emissions (below 1900 ppb). Sundarbans have been found with an anomalous correlation with meteorological variables. Apart from the anthropogenic perspective, there could also be potential environmental and geological sources of CH₄ emissions.

Keywords: Methane, Sentinel 5P TROPOMI, Land Use Land Cover, South-West Bangladesh, MODIS, ERA5, CHIRPS

Introduction

Methane (CH₄) is one of the important greenhouse gas in the atmosphere, after Carbon Dioxide (CO₂) (Kozicka et al., 2021; Naik et al., 2021). Its warming potential is 25 times greater than CO₂ (Boucher et al., 2009). CH₄ can be emitted due to geological and anthropogenic causes (Judd 2000; Etiope & Klusman 2002; Jacob et al., 2016; Jacob et al., 2021). Geological sources include degradation by bacteria, breakdown of complex organic molecules and inorganic processes deep within the earth's crust (Judd 2000). Anthropogenic sources include livestock, oil–gas, landfills, coal mines, wastewater management, and rice cultivation (Jacob et al., 2016). CH₄ in the atmosphere is increased three times since the pre-industrial period. Slow CH₄ rise between 1984 and 1999 (8.42 ± 0.62 ppb/year), lower CH₄ rise between 2000 and 2010 (2.5 ± 0.52 ppb/year), and resumed CH₄ surge between 2011 and 2021 (9.46 ± 0.57 ppb/year) (Dlugokencky, 2021). In this industrial era, prolonged emissions of CH₄ are caused by anthropogenic or natural/geologic sources, and reduction in the atmospheric oxidative capacity or combined action of all three factors remains unresolved (Nisbet et al., 2019; Turner et al., 2019).

According to Tareq et al. 2022, The Ganges River discharges to mangrove forests which is a hotspot for the study of biogenic gases (CO₂, CH₄ & N₂O) which are radioactively active gases. The Acharya et al. study showed that estuaries are a minor source of CH₄ but oscillate between sources and sinks for CO₂ and N₂O gases through water-air CO₂, CH₄, and N₂O fluxes. It was also found that the CO₂ fluxes were ~10 times higher during the monsoon seasons. In an important river in South-West Bangladesh, The Rupsha River metal concentration of As, Pb, Cd and Cr were found in sediment sample which attributed to natural sources and anthropogenic industrial activities (Tareq et al., 2022). Due to river erosion and new alluvial deposition the estuarine islands constantly change shape and position (Ashrafuzzaman et al., 2022a).

The phenomenon as climate change and sea level rise is worsened by the emission of Green House Gases (GHG's). About half of the population lives 5m below sea level, it is estimated that 17% of the territory of Bangladesh will disappear and create 20 million refugees. It has been projected by scientists that in the year 2100 the sea level rise will range from 0.53 to 0.97 m in 37 coastal stations at the Bay of Bengal, where the predicted global sea level rise is 0.09–0.88 m (Haque et al., 2019). The impacts of SLR are worsened by

floods, eroding coastlines, saltwater intrusion, increased storm frequency and ecosystem changes (Ashrafuzzaman et al., 2022b). The residents of the southwestern coastal region of Bangladesh (SWCRB) are trying to adapt to the effects of climate change and sea level rise (CCSLR) as saltwater intrusion, agricultural loss, and high-intensity cyclones (Ashrafuzzaman et al., 2022a)

Eutrophication is the process of deposition of nutrients and minerals such as phosphate and nitrates. This phenomenon hinders aquaculture farmers by changing the biochemical oxygen demand (BOD) and transparency. The agricultural sector is supposed to be the largest emitter of CH₄ gas. All the same, CH₄ emission varies seasonally depending on agricultural activities and meteorology which is intensive during June-September from agriculture. The CH₄ production and oxidation influence fertilization (Schimel 2000). The human impact of CH₄ emission induced by agricultural activities can be therefore reduced by biochar-based fertilizers modulating soil biogeochemistry and microbial activity. Spaceborne measurements as AIRS (Atmospheric Infrared Sounder), OCO (Orbiting Carbon Observatory), SCIAMACHY (Scanning Absorption Spectrometer for Atmospheric Cartography), and GOSAT (Greenhouse Gases Observing Satellite) can be used for the study of atmospheric trace gases (Schaefer et al., 2016; Singh et al., 2021).

Geographic Information System (GIS) is an effective tool to represent CH₄ emission spatiotemporally. Satellite sensors help to define CH₄ content at the global scale (Jacob et al., 2016). CH₄ observation from space on a worldwide scale includes various satellite sensors. It started SCIAMACHY instrument (Frankenberg et al., 2005), GOSAT and the TROPOMI (Tropospheric Monitoring Instrument) instrument (Lorente et al., 2021). Satellite-based methane observations have been used to study emission globally, on a continental scale and even on a local/small scale (Alexe et al., 2015; Bergamasch et al., 2013; Wang et al., 2013; Qu et al., 2021; Wecht et al., 2014; Maasackers et al., 2021; Lu et al., 2022; Miller et al., 2019; Zhang et al., 2020; Shen et al., 2021; Pandey et al., 2019; Sadavarte et al., 2021; Lauvaux et al., 2022; Maasackers, et al., 2022a,b; Feng et al., 2022). Javadinejad et al. (2019) examined GOSAT-based CH₄ emissions with different climatic parameters and observed a significant relationship between them. Among all satellites, TROPOMI is one of the most efficient sensors to monitor CH₄, because of high spatial resolution, frequent revisit, time and free availability. It is integrated with Sentinel-5 Precursor (Sentinel-5P), and its data is available from 2019. CH₄ content is evaluated using two spectral ranges, i.e., near-infrared (NIR: 675–775 nm) and short-wave infrared (SWIR: 2305–2385 nm) (Hu et al., 2016).

Study Area

The specific area of this study is located southwest region of Bangladesh, covering Satkhira, Khulna, and Bagerhat districts with the UNESCO world heritage site- Sundarbans mangrove forest. It has an Indian province in the west, Barishal district in the east, Jessore district in the south and Bay of Bengal in the north.

The extent of the study area is from 88°54'46.849 "East to 89°50'3.643 "East, from 22°52'53.362 "North to 21°57'47.624"North (Figure 1). Khulna, Satkhira and Bagerhat districts have a total population of 5,780,576 (BBS, 2011). Khulna and Bagerhat districts have a decreasing trend in population from 2001 to 2011 (Table 1). A maximum decrease has occurred in the Bagerhat district, and only the Satkhira district has an increase in population. Elevation ranges from 16 meters below Mean Sea Level (MSL) to 29 meters. The average maximum height (11.45 meters MSL) is in Sarankhola upazila (Bagerhat district), and the minimum elevation (1.89 meters MSL) is in Shyamnagar upazila (Satkhira district) (Figure 1). This area receives a total rainfall of 1750-2000 millimetres annually, and the annual average temperature is from 26° to more than 26.5° Celsius (Barry and Chorley, 2009). A geologically significant portion of this study area comprises Tidal deltaic deposits and Mangrove swamp deposits (Alam et al., 1990; Figure 2a). General soil types are majorly Calcareous Dark Grey Floodplain and Non-calcareous Grey Floodplain (non-saline) (Brammer, 1996; Figure 2b). Apart from the Sundarbans mangrove forest, major land cover classes are cropland (2962.90 sq. km) and water (1630.32 sq. km) until 2021 (Figure 2(d)(e)(f); Table 5). The Sundarbans have the highest amount of vegetation and water bodies (Table 5). Salinity level appears slight to very strong across the middle portion covering Shyamnagar, Kaliganj, Koyra, Dacope, Paikgacha, Rampal, Morelganj upazilas. The southern part of the Satkhira district is non-saline and the southern part of the Bagerhat district is intensely saline (SRDI, 2010; Figure 2c). Single crop (Boro rice) is cultivated in the majority area of agricultural land of Satkhira, Khulna and Bagerhat districts (Table 2, 3). The principal crop after Boro rice is Vegetable, cultivated in cropland and floating gardens (Nowreen et al., 2013; Table 3). Primary fish production comes from Shrimp aquaculture and ponds. Bagerhat district has a considerable fish supply from the Sundarbans area (Table 4). From the physiographic view, the concerned study area holds a unique location, environment and ecosystem in Bangladesh.

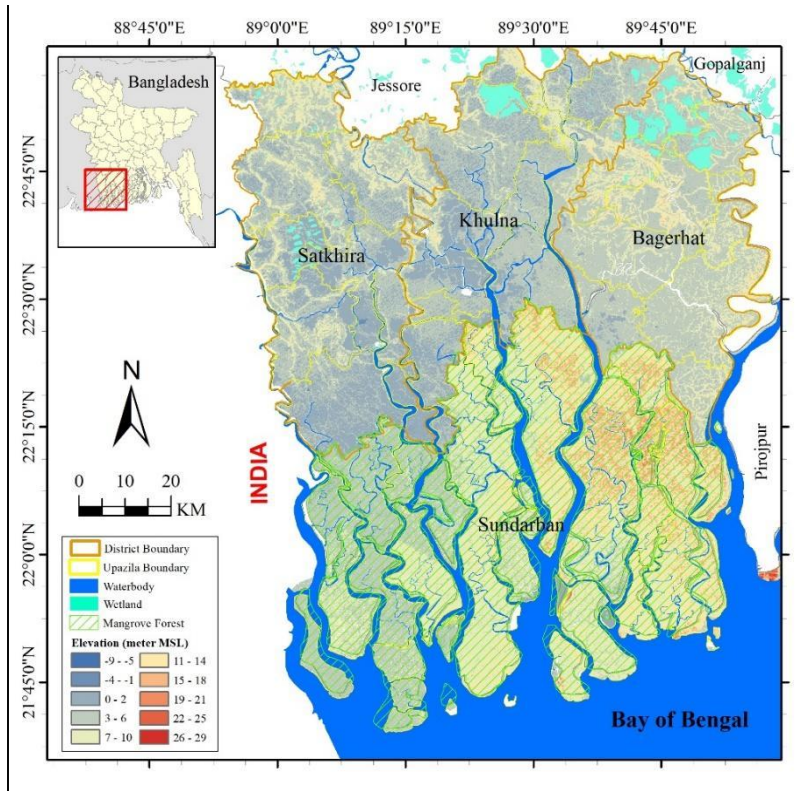


Figure 1: Study Area (South-Western Districts of Bangladesh)

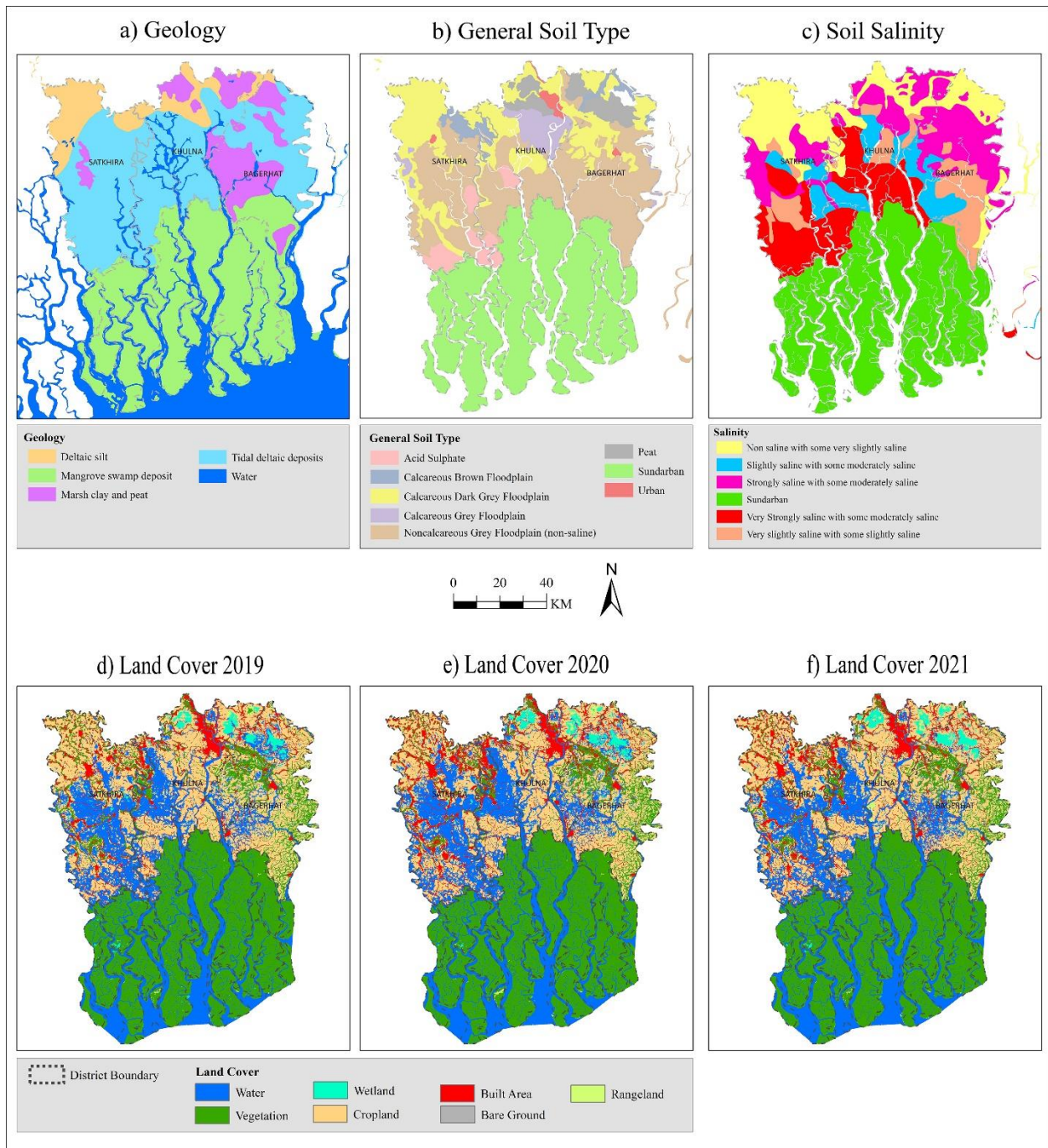


Figure 2: Different Environmental Parameters and Land Cover of the Study Area

Ma et al. (2018) observed that CH₄ emissions from inland aquaculture ponds contribute to regional and national GHG (greenhouse gas) budgets. Rosentreter et al. (2021) found that aquatic ecosystem emits half of global CH₄. Only coastal aquaculture ponds emit almost 5.9 ± 15.1 Tg (Teragram) CH₄/year. Commercial shrimp culture is also included in the aquatic ecosystem (Rosentreter et al., 2021). The conversion of brackish marsh to coastal shrimp pond causes increased emission of CH₄, even 10-fold higher

than brackish marsh emission (Yang et al., 2017). To measure CH₄ emissions from the shrimp aquaculture area, (Yang et al., 2019) collected water and sediment samples. The middle stage of culture emits a maximum CH₄ than the initial and final stages (Yang et al., 2018; Yang et al., 2019). Integrated activities of organic and inorganic processes in shrimp aquaculture are responsible for significant CH₄ emissions. The South-west region of Bangladesh is located along a coastal belt with unique land cover and environmental characteristics. Here, coastal aquaculture, especially shrimp in brackish water, is a significant fish production sector (DOF, 2021). On July 2022, fuel gas emission from a shrimp enclosure at Mongla (Bagerhat district) was reported, which was also being used for cooking activity (The Daily Star, 2022). As far as it is known, no study on CH₄ emission from this major coastal and aquaculture region of Bangladesh has been conducted yet. So, this study aims to study atmospheric CH₄ dynamics of southwest Bangladesh using Sentinel-5 TROPOMI satellite. The specific objectives of this study are to (i) study CH₄ emissions from spatial and different land cover dimensions, (ii) find out potential land cover behind CH₄ emission, and (iii) relate between CH₄ and different meteorological and surface variables. We hypothesise that (i) specific anthropogenic activities emit a significant level of CH₄, (ii) as the region is in a unique physiographic division, it may have both geological and climatic factors of CH₄ emission. This study's findings would illustrate the scientific basis for refining climate action plans to reduce GHGs (greenhouse gases) on the national, and in turn, international levels.

Table 1: Population Change, 2001-2011 (BBS, 2011)

		2001	2011
Khulna	Urban	1284208	777588
	Rural	1094763	1540939
	Total	2378971	2318527
Bagerhat	Urban	206554	195331
	Rural	1342477	1280759
	Total	1549031	1476090
Satkhira	Urban	171614	197616
	Rural	1693090	1788343
	Total	1864704	1985959

Table 2: Land Utilization Statistics (sq. km) 2019-20 (BBS, 2021)

	Satkhira	Khulna	Bagerhat
Total area	3816.19	4394.89	3957.83
Forest area	1497.34	2209.59	2294.57
Not available for cultivation area	546.33	789.14	348.03
Culturable waste area	68.8	44.52	48.56
Current fallow area	263.05	141.64	169.97

Single cropped area	890.31	752.72	704.15
Double cropped area	428.97	339.94	263.05
Triple cropped area	121.41	117.36	121.41
Quadruple Cropped area	0.00	0.00	8.09
Net cropped area	1440.68	1210.01	1096.70
Gross cropped area	2112.46	1784.67	1626.84

Table 3: Area (sq. km) Irrigated under Different Crops 2019-20 (BBS, 2021)

Region	Aman	Boro	Wheat	Potato	Vegetable	Other Crops	Total Irrigated Area
Satkhira	36.42	712.25	8.09	24.28	174.01	24.28	979.34
Khulna	24.28	598.94	-	8.09	72.84	28.33	732.48
Bagerhat	4.05	424.92	-	4.05	60.70	12.14	505.86

Table 4: District-wise Annual Fish Production (Metric Tons) of Inland Water bodies in 2019-20 (DOF, 2021)

	Satkhira	Khulna	Bagerhat
River	1380	3666	5318
Sundarbans	716	762	19529
Beel	33	228	32
Flood Plain	12674	19754	5093
Pond	39599	16040	17603
Seasonal waterbody	1761	1022	1779
Baor	201	0	10
Shrimp/Prawn Production	Bagda	24088	12549
	Galda	8631	13325
	other shrimp/prawn	4383	1733

Table 5: Different Land Cover Area (sq. km) of 2019, 2020, and 2021 (Adapted from Karra et al., 2021)

	Year	Bagerhat	Khulna	Satkhira	Sundarban	Total
Water	2019	320.73	583.82	800.45	1557.41	3262.41
	2020	331.30	607.49	820.22	1551.49	3310.50
	2021	312.53	552.65	765.13	1555.51	3185.82
Veg etati	2019	397.86	131.56	216.06	3791.00	4536.48
	2020	389.68	112.65	134.67	3801.10	4438.10

	2021	385.78	115.46	161.46	3798.97	4461.67
Wetland	2019	57.32	66.52	18.05	10.80	152.69
	2020	78.85	79.56	13.04	3.42	174.87
	2021	81.42	82.56	8.84	6.76	179.58
Cropland	2019	1051.58	1034.53	924.81	7.06	3017.98
	2020	994.51	960.53	859.93	7.20	2822.17
	2021	1010.40	1007.02	945.48	6.54	2969.44
Built Area	2019	164.59	318.13	332.98	3.04	818.74
	2020	197.83	361.64	463.15	3.26	1025.88
	2021	199.63	351.58	407.88	3.22	962.31
Bare Ground	2019	3.17	2.06	0.53	0.56	6.32
	2020	2.28	3.03	1.40	0.62	7.33
	2021	4.03	6.17	1.97	0.62	12.79
Rangeland	2019	6.99	14.27	1.05	8.08	30.39
	2020	7.79	25.98	1.53	10.86	46.16
	2021	8.45	35.44	3.18	6.34	53.41

Methods and Data

The study area has four parts: Satkhira, Khulna, Bagerhat district and Mangrove Forest Sundarban of Bangladesh. Sentinel-5 TROPOMI has been used in this study. The used band for CH₄ is the column-averaged dry-air mixing ratio of CH₄ (in ppb—parts per billion). Data were retrieved from 8 February 2019 to 22 September 2022 using Google Earth Engine (GEE). CH₄ from Sentinel-5 TROPOMI has been validated by GOSAT satellite and ground-based TCCON instruments. CH₄ images have a spatial resolution of 1 × 1 KM (ESA, 2021). A total of 767 images have been analysed for this study. Due to cloud coverage,

there is also some missing CH₄ data on specific dates/months (ESA, 2021). Raster datasets of the column-averaged dry-air mixing ratio of CH₄ have been used as the primary component. CH₄ raster datasets have been averaged for 2019, 2020, 2021, and 2022. The only exception marked was 2022, which had datasets from January 2022 to September 2022. For the land cover of 2019, 2020 and 2021, raster datasets have been adapted from Sentinel-2 land cover (Karra et al., 2021; Figure 2(d,e,f). Moreover, MODIS (Moderate Resolution Imaging Spectroradiometer) sensor is an essential tool that covers data from both land and ocean over a broad scale. It has 36 different bands, which collect data on the earth after 1 to 2 days. Its image pixel has a resolution from 500 metres to 1 KM for other band datasets. Normalised difference vegetation index (NDVI) from MOD13Q1 band, Normalised Difference Water Index (NDWI) from MOD09GA band and land surface temperature (LST) from MOD11C3 band by MODIS satellite have also been used. NDVI represents vegetation, cropland, and grassland, whereas NDWI correspondence to water, wetland, and flooded surface. Time series of mean air temperature and precipitation for each district/area has been retrieved from ERA5 Copernicus Climate Change Service and Climate Hazards Group InfraRed Precipitation with Station data (CHIRPS) respectively (C3S, 2017; Funk et al., 2014)

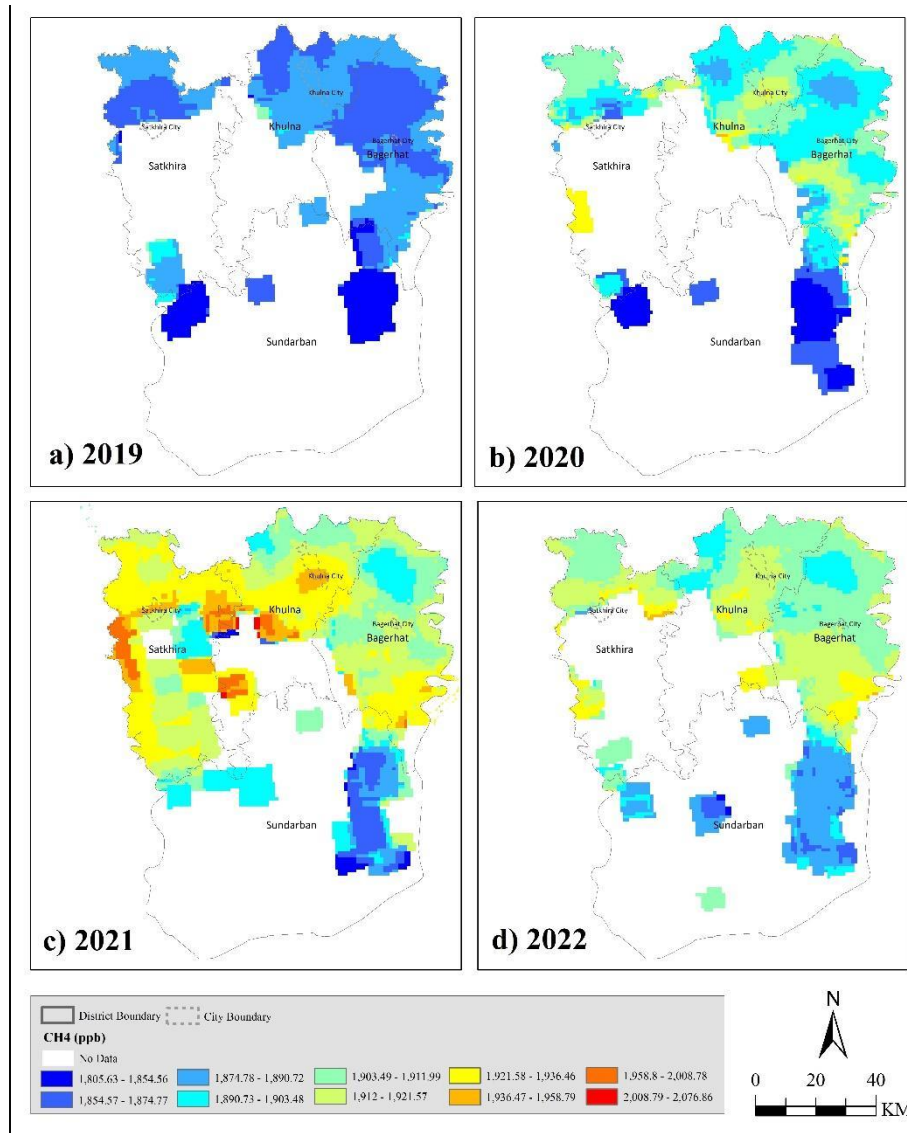


Figure 3: Average CH4 Emission Map by Year

In the study, CH4 time series data for a particular district/boundary has been retrieved to assess temporal change. Zonal statistics have been done using QGIS 3.10 software. First zonal statistics have been calculated to get CH4 distribution statistics within a particular area/boundary. After that, zonal statistics were done between CH4 and land cover raster datasets, revealing CH4 variations over different land covers.

Javadinejad et al. (2019) stated that CH4 emission dynamics impact meteorological/climatic variables. Correlation between the monthly average of CH4 and air temperature, precipitation, LST, NDVI, and NDWI have been done using R (v. 4.1.3). Mean CH4 and other parameter values of each district/boundary over a time series have been used to do Pearson's correlation. The correlation formula is mentioned below:

$$r = \frac{\sum(x_i - \underline{x})(y_i - \underline{y})}{\sqrt{\sum(x_i - \underline{x})^2 \sum(y_i - \underline{y})^2}}$$

In this formula, each variable has been taken as x and y representing CH₄ count. Pearson's correlation coefficient represents a degree of changes and inter-relational strength between CH₄ and each climatic variable.

Result & Discussion

Figure 3 shows Spatio-temporal changes of CH₄ over different districts. Among all districts, CH₄ emissions increased over Satkhira from 2019 to 2021. The interior of the Sundarban boundary has lower emissions in all years. The statistical variables of the CH₄ of different districts are shown in Figure 4a, including average, minimum and maximum values. CH₄ raster data is plotted over value and pixel frequency. Khulna district has a full range of CH₄ emissions, particularly Paikgacha upazila has the peak emission. Debhata upazila of Satkhira district has remarkable CH₄ emission on average. In comparison to the three districts, Sundarban has low CH₄ emission and its frequency is also down.

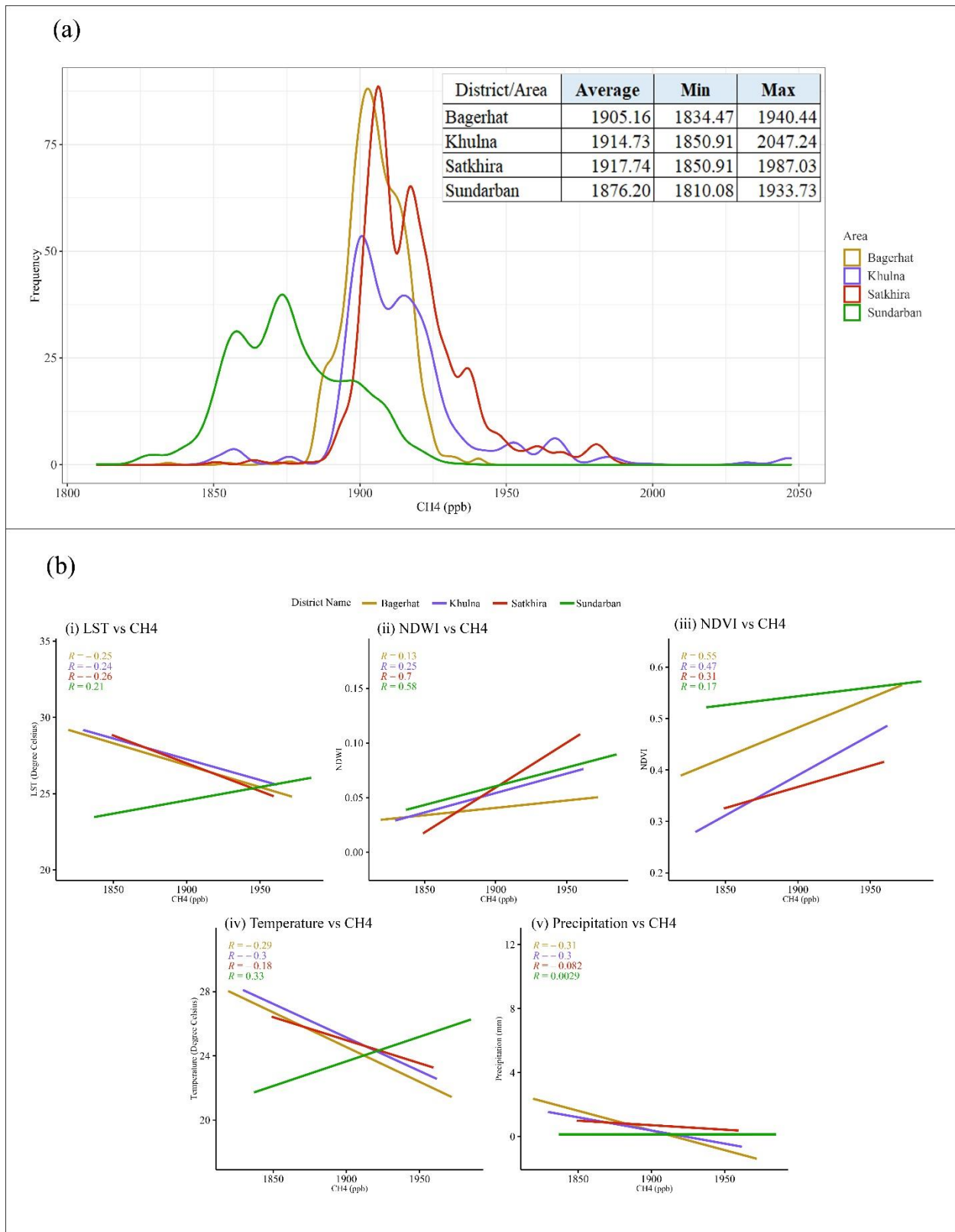


Figure 4: (a) Averaged CH4 Distribution by District, (b) Correlation between Monthly CH4 and Other Parameters

The monthly emission from 2019-2022 of three districts and Sundarban is plotted in Figure 5. Some dates/months do not have CH₄ data due to cloudiness in the middle of the year, especially during monsoon season (ESA, 2021). CH₄ emission is increasing at particular months (especially the dry winter season) than the previous year. Both Khulna and Bagerhat had continuous CH₄ increases from January to March. Besides, Satkhira and Sundarbans have similar trends from January to March and December to March, respectively (Figure 5(c)(d)).

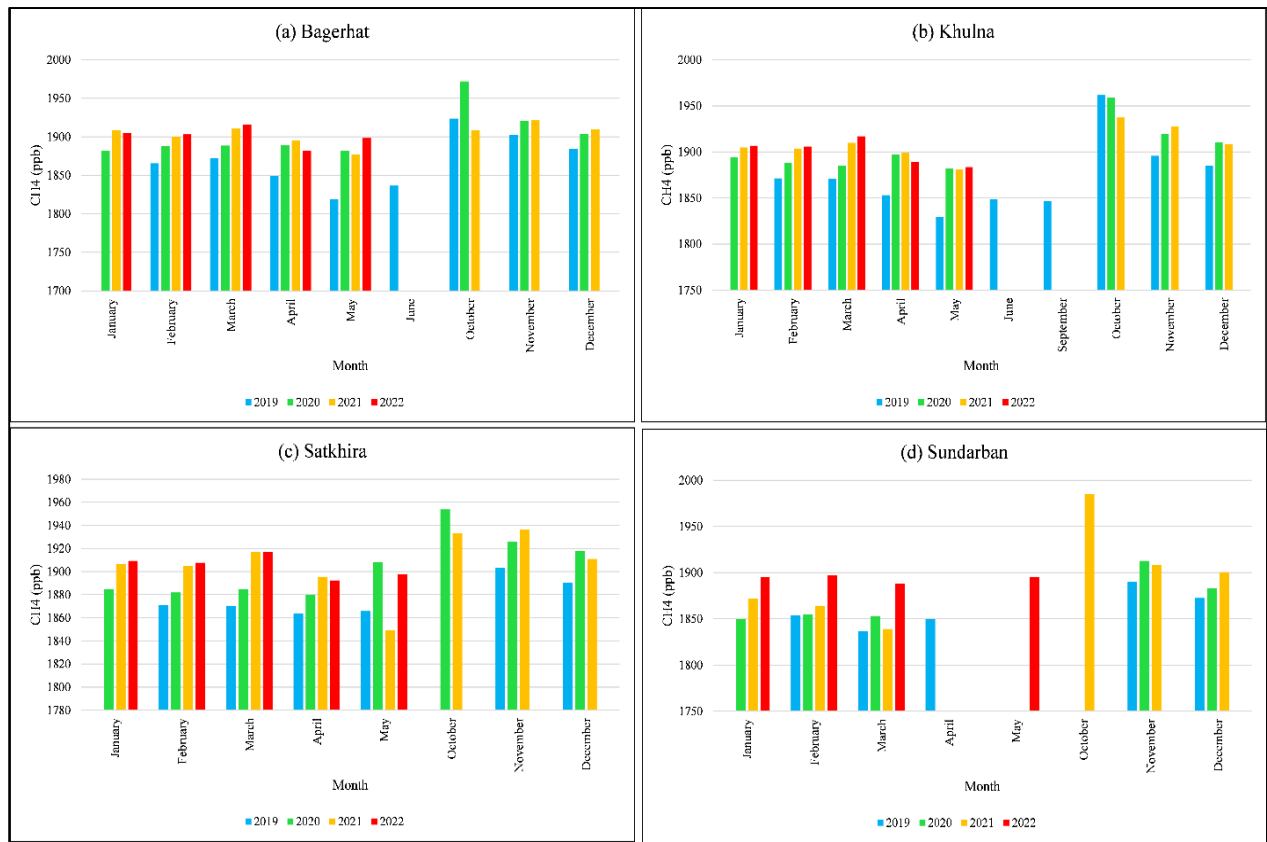


Figure 5: Monthly CH₄ Change of Different Areas (2019-2022)

Figure 6(a)(b)(c) show comparatively irregular and higher CH₄ emissions from bare ground and rangeland. The bare ground represents brick kilns and heavy industries, potential CH₄ emitters (Khan and Paul, 2021). Most brick kilns are situated in Koyra, Dumuria, Rupsa (Khulna district), Satkhira sadar, Kaliganj, Assasuni (Satkhira district). As Mongla seaport is located in this region, many industries in Rampal upazila (Bagerhat) are built on the bank of Mongla river. The geographic location of navigation opportunities in this region is a significant cause behind the development of seaports and industries. Rangeland is fallow land seasonally used for crop cultivation and aquaculture. Cropland and water show an increasing trend of CH₄ in three districts. CH₄ emissions from cropland can be interpreted as follows, single crop practice,

majorly boro rice cultivation (Table 2, 3). Aquaculture, especially shrimp culture, is being done over a massive area of water and wetland. Seasonally it is also cultured in cropland with rice (Barmon et al., 2004). As coastal aquaculture is regarded as a source of CH₄, this major shrimp aquaculture also causes emissions from the cultured area (Ma et al., 2018; Rosentreter et al., 2021). CH₄ emission from built areas seems to have an irregular trend in all districts except Satkhira. By 2021 in Sundarban, CH₄ from cropland and built area emits CH₄ more than 1900 ppb (Figure 6d). Vegetation from everywhere shows an emission level below 1900 ppb. Apart from anthropogenic factors, natural biogeochemical and geological processes in the coastal region could release CH₄ into the atmosphere (Arai et al., 2021; The Daily Star, 2022).

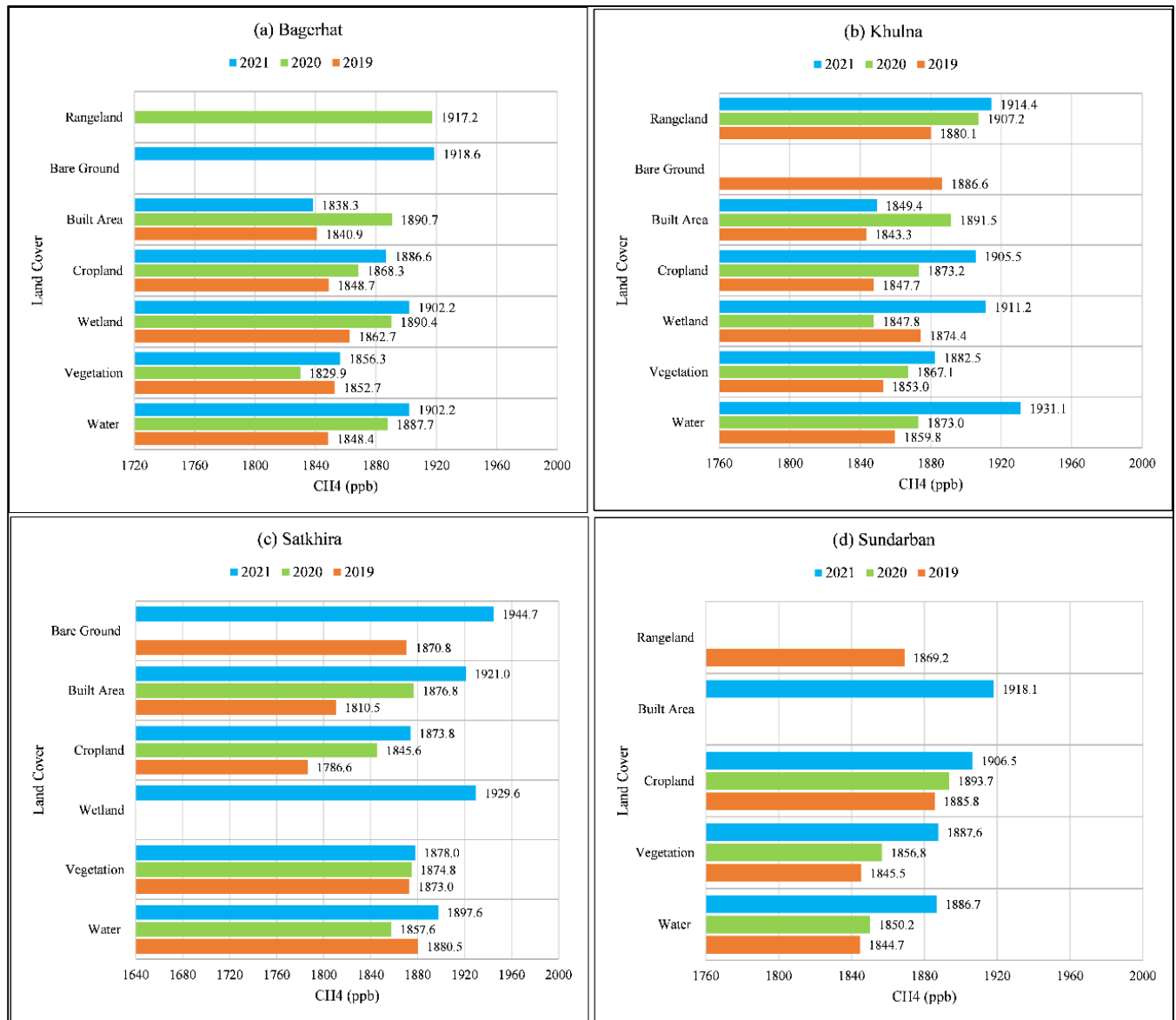


Figure 6: Average CH₄ Distribution over Different Land Cover (2019-2021)

After preliminary statistical analysis, as shown in Figure 4a, 5, and 6, it is essential to understand a more precise CH₄ relationship. Pearson's correlation was done to interpret the relationship between CH₄ and the meteorological-surface parameter. Each variable has been averaged by month from February 2019 to August 2022. Meteorological parameters include temperature (°C), precipitation (millimetre) and surface parameters include LST (°C), NDWI, and NDVI (Figure 4b).

As shown in Figure 4b (i), CH₄ has weak negative relation with LST in all areas except in Sundarbans. All areas exhibit positive relations with NDWI (Figure 4b (ii)), where Satkhira has strong, Sundarbans has moderate, Bagerhat and Khulna have weak relations. CH₄ emission from coastal aquaculture is verified from this positive relation with NDWI. Bagerhat and Khulna exhibit middle positive relations with NDVI (Figure 4b (iii)), whereas Satkhira and Sundarbans have weak positive relations. Cultivation of rice in most cropland is a possible reason for such emission relation with NDVI (Table 2, 3, 5). In three districts, CH₄ has a weak negative association with temperature (Figure 4b (iv)). Except for Sundarbans, other areas tend to be negatively related to precipitation, which is lower than those found in similar studies (Figure 4b (v); Javadinejad et al., 2019). Only in the Sundarbans, CH₄ has a weak positive relation with LST, temperature and a fragile positive association with precipitation (Figure 4b (i)(iv)(v)).

Conclusion

The aforementioned study shows that each area has an increasing trend of CH₄, especially in the dry winter season. Significant CH₄ emissions are observed from cropland and water, as these are dominant land cover in all three districts. Integrated single-crop rice cultivation and shrimp aquaculture are essential factors. Moreover, excessive brick kilns and industries near cities and seaports also trigger emissions. A weak association has been found with CH₄ regarding surface feature parameters like NDVI and NDWI, which validates emission from shrimp enclosure and rice field hypothesis. Due to extensive coastal aquaculture, CH₄ has a strong relation (0.7) with NDWI in Satkhira (Table 4). Positive relation with NDVI in the coastal region is also reported by Javadinejad et al. (2019). CH₄ emission from crops, especially rice fields, is a proven fact. But in recent decades, several studies have found CH₄ emission from aquaculture in many coastal regions of the world (Ma et al., 2018; Rosentreter et al., 2021); Yang et al., 2017; Yang et al., 2019). LST, temperature and precipitation have behaved weakly negative for all districts. Only in the Sundarbans, CH₄ has a weak to moderate positive relationship with all parameters. There are some anomalies have been observed for LST and temperature. Similarly, LST showed an anomalous trend in a study on Khulna (Dewan et al., 2021). Apart from human-induced activities, there can be possible geological emission causes, as reported in a report before (The Daily Star, 2022).

In the near future, the findings of this study are expected to prove efficient for further work given climate change. The study illustrates the scenario of CH₄ emission on a regional scale to progress the UN's

sustainable development goals (SDGs) achievement. It will be a prospective field to study this region's biometeorological and microclimatic dynamics in the coming days.

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