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ORIGINAL ARTICLE

Modeling of potential gully erosion hazard using geo-spatial technology at Garbheta block, West Bengal in India

Pravat Kumar Shit[1] · Rumpa Paira[3] · GouriSankar Bhunia[2] · Ramkrishna Maiti[3]

Abstract The gully erosion is the most serious environmental problem in West Bengal in India. Present study focused on delineation the gully affected areas and characterization of geo-environmental factor in the gully affected region to prevent future problems. Ground investigation and geo-spatial data along with bivariate statistical approach were employed to identity the most crucial factors among lithology, dynamic and slope inclination, landuse, aspect, plan curvature, stream power index, topographical wetness index and length-slope factor and also understand the most dominant class of each factor associated the gully erosion in the area under study. All the information were integrated into geographical information system platform and categorized in zones of very high, high, moderate, and low gully erosion susceptibility. Weight index overlay method is used to validate the gully proneness map. Results showed land use factor (barren land and waste land), slope (>20°), topographical wetness index values (>1.2), length-slope index (>4.00), fragments of pebbles, boulder and gravels, older alluvium and lateritic soil play important roles in gully processes. Model validation indicated that the resulting map of areas prone to gully erosion has a prediction accuracy of 88.25 %. The methodology adopted for gully erosion proneness mapping can be exercised in other gully vulnerability areas that could be an excellent approach to defend the natural resources and progress in the land use conservation.

Keywords Gully erosion · Bivariate statistics · GIS based method · Gully proneness mapping

Introduction

Gullying is one of the most important parts of the soil erosion processes which largely contribute to the sculpturing of the earth surface over the last decade (Shit et al. 2014). The development of gullies causes the loss of a great amount of soil and can be considered as one of the principal causes of geo-environmental degradation (Vanwalleghem et al. 2005; Marzolff et al. 2011). Additionally, the configuration of gullies entails an amendment of overland flow, a reduction of runoff lag time and an increase in runoff volume. Generally, the growing interest in studying gully erosion reflects the need to increase our knowledge on its impacts and controlling factors that vary under a wide range of causes (Valentin et al. 2005). Erosion generally moves rocky materials or soil particles after the progressions of weathering have wrecked them down into lesser quantities which are transportable. Remote Sensing (RS) and Geographical Information System (GIS) integrated erosion forecast models do not only approximate soil loss but also offer the spatial distributions of the erosion (Okalp 2005). Particularly, generating precise erosion risk maps in GIS platform is extremely noteworthy to establish the areas with high erosion risks (Mitasova et al. 1996) and to expand plenty erosion deterrence techniques (Vrieling et al. 2002).

Appraising the soil erosion rate is crucial for the progression of ample erosion deterrence measures for

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sustainable supervision of land and water resources. GIS technology is precious tools in embryonic environmental models based on data storage, management, analysis, and display. Several studies have been conducted on modelling soil erosion by utilizing RS and GIS technologies (Yuksel et al. 2008; Prasannakumar et al. 2012; Sinha and Joshi 2012; Nasre et al. 2013; Baroudy and Moghanm 2014). However, gully erosion occurrence and behaviour have been limited and reported the spatial distribution of soil loss due to the constraint of limited samples in complex environments. Conversely, mapping of gully erosion in large areas is often very difficult by traditional methods. Earlier studies have investigated the prediction of gully erosion susceptibility zone based on topographical variables (Poesen et al. 2003; Chaplot et al. 2005).

The present study aims to identify dominant the geo-environmental factors of gully erosion and also to demarcate the probable zone of gully erosion through geo-spatial technology.

Materials and methods

Study area

Garbheta block in Paschim Medinnipur district of West Bengal, India is a typical humid region very prone to shallow erosion (Bandyopadhyay 1998; Sen et al. 2004) that may initiate debris flows; similarly, gullies are also very widespread throughout the region, affecting different lithologies and soil types(Shit and Maiti 2012a, b; Shit et al. 2013a, b). The study area of about 35.20 km^2, between is located 22°47′12″N and 22°56′27″N latitude, and 87°13′17″E and 87°23′29″E longitude (Fig. 1). The climate is tropical type with hot, dry summers, having precipitations concentrated in monsoon period (July to September) (Sen et al. 2004). Mean annual rainfall is about 1450 mm, distributed in 110 rainy days on an average, while mean annual temperature is 28 °C and mean monthly temperatures range between 8 °C in January and 43 °C in June (Shit et al. 2013a). The Shilabati River (Silai) is the main stream, originated from the Chhotanagpur Plate west to east for the length of about 26 km.

Geomorphologically, the study area is a part of the Chhotanagpur plateau margin extremely dissected, discontinued and is characterised and rolling lands. The formation of Pali (∼1000 m) is portrayed by pebbly to coarse-grained micaceous sandstones, medium to fine grained sandstones, and red and green coloured mudstones in the study area (Dey et al. 2009).

The study area falls in a part of passive to extensional cratonic margin in the west of Bengal basin or the western geotectonic province. Niyogi (1970) and Pal (2002) have identified this place as a part of paleo-coastal zone of Bengal basin. The land surface of the study site is characterized by hard and rocky up- lands, barren lateritic covered area and non-arable lands. In the study area, the main erosive processes that affect the landscape are related to runoff waters and mass failures that causes of gully erosion.

Mapping of gullies

Gullies in Garbheta badland area were mapped in Google Earth from the Digital Globe images of 2013 based on the visual interpretation of the images. Digital layers were saved as KML files from Google Earth. Data created in Google Earth into Arc GIS, the R-statistics freeware was used to convert Keyhole Markup Language (KML) files into shape files ('.shp file format') (Frankl et al. 2013; Dube et al. 2014). Ground truthing was done for the identified gullies in the study area during October to December 2014.

Gully erosion influential factors

Several factors contribute to gully erosion and they have been well described in the literature, including topographical variables (BouKheir et al. 2007; Kakembo et al. 2009; Conforti et al. 2011; Conoscent et al. 2013; Dube et al. 2014), parent material-soils interactions (Laker 2004; Valentin et al. 2005) and cover management (Boardman et al. 2003; Boardman and Foster 2008; Gómez Gutiérrez et al. 2009a, b). The development of gully erosion proneness models requires the selection of environmental factors able to reproduce the geographical variability of the main factors potentially controlling the phenomenon; for this research, the selection was based on geomorphological knowledge of gully erosion phenomena and on the availability, for the area, of environmental data related to erosion processes. Gully erosion occurrence and behaviour of this phenomenon depends on climate, topography, lithology, soil characteristics and land use (Poesen et al. 2003; Gómez Gutiérrez et al. 2009a, b). Proneness to gully erosion is a function of erodibility of out cropping materials and erosivity of runoff (Conoscenti et al. 2008; Conforti et al. 2011). The present study considered four erodibility and six erosivity variables for determination of gully erosion proneness mapping. The erodibility factor included: lithology/geology, geomorphology, soil and land use-land cover (LULC). The erosivity variables considered as elevation and aspect, plan curvature, stream power index (SPI), topographic wetness index (TWI) and length-slope factor (LS) (Conforti et al. 2011; Dube et al. 2014). All the morphometric characteristics were automatically derived from Advanced Space borne Thermal Emission and
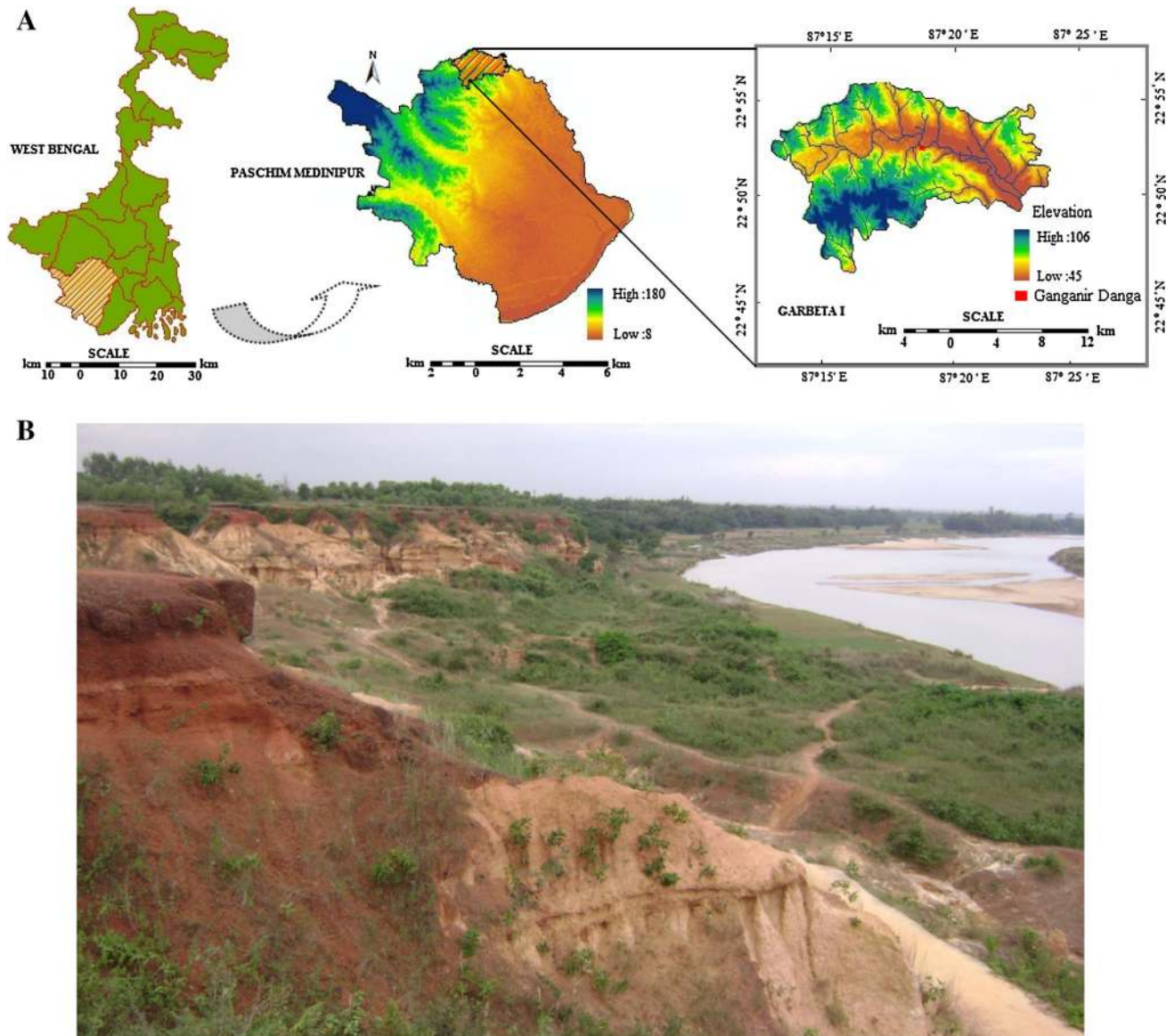
Fig. 1 Location of the study area **a** elevation map of Garbheta Badland, **b** partial view of Ganganir Danga at Garbheta badland along the Silai River

Reflection (ASTER), Digital Elevation Model (DEM) data with a 30 m resampled to 2.5 m resulation.

Lithology and soil Gully erosion is positively associated to the lithology, of the earth surface. A comprehensive analysis of the major lithological characteristics has been executed by amalgamated data from the geological map of Garhbeta at 1:25000 scale with the data collected from field survey. Soil information was obtained from the soil map of District Planning Map of Paschim Medinipur at 1:25,000 scale with field survey following FAO (1974) classification. First we scanned and geo-referenced these map using ground control points (GCP) by the process of single map/image rectification in ERDAS IMAGINE 8.5v and Arc-

GIS software 9.2v, then a polygon vector layer was created and the entire soil groups and lithology map was digitized.

Land use and land cover (LULC) Land use played an important role on the geomorphological stability of a slope. Barren and sparsely vegetated areas are exaggerated by earlier erosion and greater unsteadiness than forests (Dai et al. 2001; Cevik and Topal 2003). The presence of a plant cover lessens intensity of gully erosion, because it decreases the erosive action of surface runoff. A land use map has been generated using Landsat Thematic Mapper data and IRS 1C LISS-III. The images were resampled to a pixel size of 2.5 m. Supervised classification was done using the maximum likelihood classifier (MLC) algorithm of

ERDAS IMAGINE v.8.5. The maximum likelihood classification algorithm assumes that spectral values of training pixels are statistically distributed according to a multivariate normal (Gaussian) probability density function. Consequently, classification results were then assessed for accuracy using the 2013 Google Earth image of the study area combined with field based ground control-points determined in the study area using a hand-held Garmin GPS (Model: 76CSx, accuracy ±3 m). Accuracy assessment of the land cover classes was estimated based on the method followed by Rogan et al. (2002).

Length-Slope factor   The length-slope factor (LS) is used to consider the effect of topography on erosion. The topographical parameter depends on the steepness of slope (S) and the length of slope (L). The LS has been calculated based on the equations described by Moore and Burch (1986). Flow accumulation was calculated using the watershed delineation tool of Arcview software 3.2.

$$LS = (fa \times cellsize/22.13)^{0.4} \times (\sin \sigma/0.0896)^{1.3} \quad (1)$$

where fa is flow accumulation and is derived from the DEM using a GIS accumulation algorithm (Lee 2004) and σ is slope in degrees.

Aspect   Aspect is deemed as an important factor in vulnerability studies of denudational processes (Nagarajan et al. 2000). The aspect of a slope can control gully erosion processes, as it controls the exposure to numerous climate conditions and the vegetation cover (Pulice et al. 2009).

Topographical wetness index (TWI)   TWI is a function of both the slope and the upstream contributing area per unit width orthogonal to the flow direction (Gumindoga et al. 2011; Dube et al. 2014). The TWI gives the spatial distribution and zone of saturation sources for runoff generation. TWI has been calculated based on the method followed by Moore et al. (1991).

$$TWI = \ln[As/\tan(\beta)] \quad (2)$$

where, As is upstream contributing area and β is the slope gradient.

Stream power index   The stream power index (SPI) is one of the main dominating factors of slope erosion processes. SPI is a measure of the erosive power of water flow based on the hypothesis that discharge is comparative to the specific catchment area (As). SPI is calculated based on the method followed by Moore et al. 1991. The erosive power of running water controls toe erosion and river notch (Nefeslioglu et al. 2008), and also indicative of the potential energy available to entrain sediment (Kakembo et al. 2009).

$$SPI = As \times \tan \sigma \quad (3)$$

where, As is the specific catchment area in meters and σ is the slope gradient in degrees.

Gully proneness analysis

To assess the gully erosion vulnerability, information value method was used outlined by the earlier workers for proneness mapping (Cevik and Topal 2003; Yalcin, 2008). In this method, all the data were obtained in a single platform in GIS environment and the application of a bivariate statistical method was used in this study. This statistical calculation is based on the pragmatic relationships between each influential factor and the allocation of gully areas. The thematic maps generated for each predisposing factor (geomorphology, soil, lithology, land use, elevation, aspect, plan curvature, SPI, TWI and LS) have been transformed in raster format through ArcGIS software. A gully inventory map was developed in order to compute the density of the gully areas for each class of the predisposing factors. The estimated density symbolizes the proneness level of the considered predisposing factor class. A weight value for a parameter class was defined as the natural logarithm of the gullies density class divided by the area of gullies density over the entire study area. In the present study, weight value for a parameter class was delineated as the natural logarithm of the gullies density class divided by the area of gullies density over the entire study area (Yin and Yan 1988; Van Westen 1993; Conforti et al. 2011; Dube et al. 2014).

$$Wi = \ln \frac{DensClass}{DensMap} = \ln \frac{N_{pix}S_i / N_{pix}N_i}{\sum N_{pix}S_i / \sum N_{pix}N_i} \quad (4)$$

in which Wi = weighting value of the class i; $DensClass$ = density of the gullies in the class i; $DensMap$ = density of the gullies in the whole study area; $N_{pix}S_i$ = number of pixels that contains gullies in the class i; $N_{pix}N_i$ = number of pixels within the class i; $\sum N_{pix}S_i$ = total number of pixels that contain gullies in the whole study area; $\sum N_{pix}N_i$ = total number of pixels of the whole study area.

Finally, the weighted overlay index method was used to calculate the proneness value to delineate gully eroded area (Fig. 2) and characterize the badland units. In this method overlay procedures has been performed on reclassified maps in GIS environment. All the information has been resampled into 2.5 m pixel size in GIS environment. All the layers overlayed by applying the "Raster Calculator" tool in the "Spatial Analyst" extension of ArcGIS v9.2 in order to calculate the potential gully erosion susceptible zone of the study area. The conquered ranges of values have been categorized into five proneness classes based on the natural-breaks of erosion.
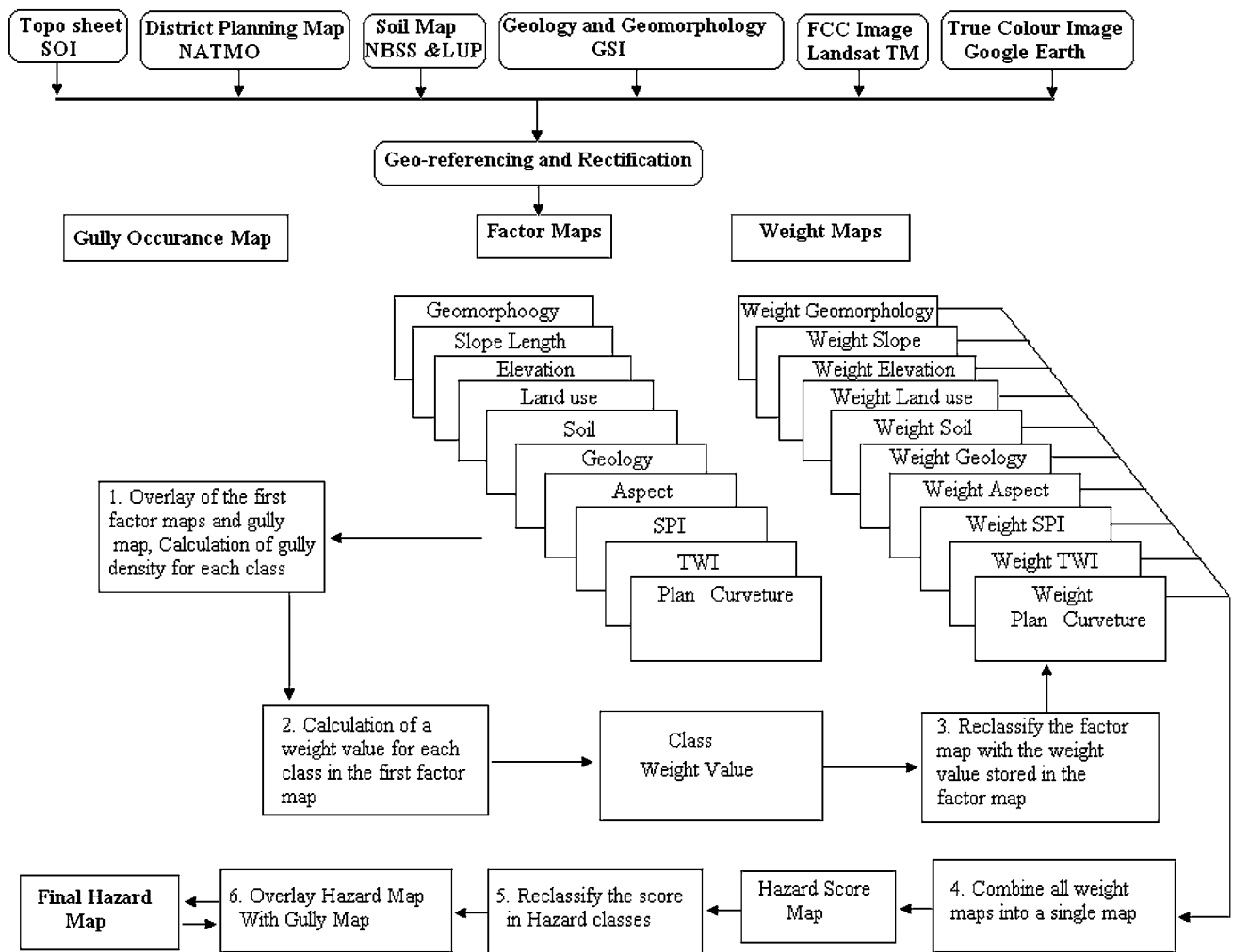
Fig. 2 Flow chart of the methodology (*SOI* survey of India, *NATMO* National Atlas Thematic Mapping, *NBSS* and *LUP* National Bureau of Soil Survey and Land Use Planning, *GSI* Geological Survey of India)

Accuracy assessment

A total of 100 sample sites were selected randomly from recent gully erosion zones in the field to validate gully erosion proneness model. The location of each sample site were recorded through Global Positioning System (GPS). The success rate curve was estimated to assess the ability of gully erosion proneness model and factors considered to predict the gully (Chung and Fabbri 2003). Prediction rate curve is computed for gully distribution patterns (in the training area) for a time point posterior to the training data set's temporal domain. To produce the success rate and prediction rate curve, the estimated index values of all cells were organized in descending order and were allocated into 100 equal classes extending from very high to very low proneness classes. Then the order of cell values were categorized into 100 classes using "quantile" method in ArcGIS, with 1 % cumulative intervals. The gully proneness map derived through weighted index overlay method

is also prepared with slicing operation in ArcGIS software. After that, the calculated 100 classes were overlaid and crisscrossed with the set of gullies worn in creating the model (assessment gully group) to regulate the percentage of gully occurrences in each gully proneness class. Finally, the success rate curve was assembled by depicting the susceptible classes starting from the highest values to the lowest values on the X-axis and the cumulative percentage of gullies occurrence on the Y-axis (Remondo et al. 2003). Therefore, the area under the curve can assess the model validation quantitatively.

Results

Gully erosion processes

Table 1 represent the density of gully areas and the weighting values obtained using the information value

Table 1 Weighting value (Wi) distribution for each class of the selected gully occurrence influential factors

Factors	Sub-category	$N_{pix}N_i$	$N_{pix}S_i$	Denseclass	W_i
Soil	Lateritic soil	247,455	8123	0.03283	0.091
	Older alluvial soil	159,000	4123	0.02593	−0.146
Geomorphology	Upland plains	170,597	5170	0.03031	0.001
	Paradeltaic fan surfaces	7314	28	0.00383	−2.066
	Duricrusts	5368	25	0.00466	1.875
	Pediments and pediplans	39,854	125	0.00314	−2.269
	Flood plains	183,322	6898	0.03763	−0.225
Plane curvature	Concave	81,858	5711	0.06977	0.843
	Flat	241,586	2514	0.01041	−1.098
	Convex	83,020	4021	0.04843	0.478
Geology	Unconsolidated sands, silts and clay	100,716	2129	0.02114	−0.351
	Fine and medium sands	29,073	103	0.00354	−2.148
	Fragments of pebbles, boulder and gravels	276,666	10,014	0.03620	0.182
Elevation (meters)	40.0–50.0	71,745	389	0.00542	−1.711
	50.0–60.0	67,521	589	0.00872	−1.321
	60.0–70.0	69,875	686	0.00982	−1.118
	70.0–80.0	63,744	2806	0.04402	0.382
	80.0–90.0	94,328	3968	0.04207	0.336
	90.0–100.0	39,245	3808	0.09703	1.173
Stream power index (SPI)	0.0–0.50	21,306	148	0.00695	−1.469
	0.50–1.00	32,167	245	0.00762	−1.373
	1.00–1.50	107,725	897	0.00833	−1.284
	1.50–2.00	202,552	1902	0.00939	−1.203
	2.00–2.50	33,809	2801	0.08285	1.015
	2.50–3.00	8899	6253	0.70266	3.153
Slope of length (LS)	0.01–0.07	210,299	889	0.00423	−2.014
	0.07–0.81	64,110	760	0.01185	−0.933
	0.81–2.50	50,307	778	0.01547	−0.666
	2.50–5.00	41,804	3789	0.09064	1.098
	5.00–7.50	39,488	6030	0.15270	1.627
Topographical wetness index (TWI)	0.0–0.5	98,745	210	0.00213	−2.708
	0.5–1.0	44,985	213	0.00473	−2.014
	1.0–1.5	73,394	1000	0.01363	−0.836
	1.5–2.0	178,416	4800	0.02690	−0.143
	2.0–2.5	10,912	6023	0.55196	2.912
Aspect	Flat	34,237	563	0.01644	−0.603
	North	50,049	869	0.01736	−0.567
	North-east	52,036	786	0.01510	−0.693
	East	48,204	1114	0.02311	−0.261
	South-east	48,482	1206	0.02488	−0.223
	South	50,295	2500	0.04971	0.491
	South-west	52,155	2800	0.05369	0.569
	West	47,731	1865	0.03907	0.262
	North-west	23,266	543	0.02334	−0.257
Land use and land cover (LULC)	Barren land	5476	2986	0.54529	2.899
	Agricultural land	113,724	3500	0.03078	0.001
	Scrub land	43,925	1103	0.02511	−0.182
	Dense forest	124,810	1268	0.01016	−1.098
	Open forest	106,884	1399	0.01309	−0.836
	Waste land	9576	1986	0.20739	1.933
	River	2060	4	0.00194	−2.759
		$\sum$npixni	$\sum$npixsi	Dens map	
		406,455	12,246	0.03013	

method indicating the magnitude of the class of each pre-disposing factor. Positive or negative values of W_i points out whether the considered class of each influential factor is relevant or not in the development of gullies, respectively.

Geomorphology

The geomorphology of the Garbheta is strongly controlled by geological and structural setting (Fig. 3a). The western sector consists of lateritic undulating landscape characterized by steep slopes, more than 15° in average, and a high local relief resulting in severe drainage downcutting. Lateritic undulating landscape (Duricrust) has positive role of gully erosion ($W_i = 1.875$). Slopes have rectilinear–convex profiles and are often highly dissected by V-shaped valleys (Fig. 8). Conversely, gentle slopes characterize the central and eastern sectors of the area; denudational processes, mainly gullies and rill wash processes, substantially affect undulating slopes. Slope profiles are generally very articulated, with concave–convex shapes and mainly characterized by concave valley floor.

Lithology and soil

The great assortment of lithological types cropping out in the study area has been categorized into three classes based on their compositional and mechanical properties. Two classes of soil texture defined in the study area (Fig. 3b), the fine-medium (71.4 %) and the medium (28.6 %) classes are the most frequent. The results of our analysis also showed fragments of pebbles, boulder and gravels have positive roles on gully erosion process ($W_i = 0.17$) in the study area. The morphological analysis showed that Garbheta is affected by permanent gullies; they are often characterized by incisions with vertical sidewalls and depth of 10–20 m (Fig. 8).

Gullied areas were mainly characterized by dendritic and trellis drainage patterns. Soil properties showed that both the older alluvium ($W_i = 0.03$) and lateritic soil ($W_i = 0.13$) have the positive influence on gully occurrence (Table 1). The most evident and spectacular landforms related to gully erosion in the study area are represented by *GanganirDanga* badlands, almost exclusively developed into clayey litho types with a channel network mainly characterized by a dendritic pattern (Fig. 3c).

Land use and land cover (LULC) characteristics

Land use characteristics of the study site have been categorized into seven classes (Fig. 3d). Agricultural land of the study area is covered by 56.91 % (20,100.51

Hectares) and 24.76 % (8741.7 hectares) area is covered by dense, degraded and open forest land. Consequently, the fallow land is covered by 8.58 % (3029.76 hectares) and settlement area is enclosed by 3.57 % (1261.44 hectares) of the entire study site. On the southern part of the study site Silai river is flowing from west to east direction covering an area of 1.17 % (412.29 hectares) of the study site and the river bed constitute gets deposited by sand in an enclosed area of 248.58 hectares (0.70 %). The grass land is 4.31 % (1523.97 hectares). Table 2 identified the error matrix of LULC image derived from the supervised classification technique. The overall classification accuracy and kappa statistics were 86.00 and 0.83 %, respectively.

Land use factor plays an important role in gully processes ($W_i = 0.83$), mainly on barren land ($W_i = 1.35$) and waste land ($W_i = 0.93$). Result of our analysis also showed that agricultural land and scrub land have positive influence on gully erosion, while river, dense forest and open forest have negative impact on gully erosion (Table 1).

Elevation

The elevation map of Garhbeta was derived from ASTER DEM. The altitudinal range of Garhbeta block is varied from 40–100 m (Fig. 4a). Based on the elevation characteristics, the study area has been divided into six categories with 10 m interval. The highest elevation is observed the southern part of the study site, whereas the more than 70 m elevation determined the positive value of gully erosion.

Aspect and plan curvature

The aspect classes of the study area show a fairly homogeneous distribution (Fig. 4b). East and south-east facing slopes are comparatively less frequent. Plan curvature determines the curvature of a contour line formed by intersecting a horizontal plane with the surface (Wilson and Gallant 2000). Positive values of plan curvatures indicating the convexity; whereas the concavity of slope is determined the negative values of plan curvatures. The result of our analysis showed most of the gully eroded area in Garhbeta block is closely associated with the concave slopes (Fig. 4c).

Length of slope factor

The spatial pattern of the LS factor is shown in Fig. 4d and its values have been classified in five classes. Table 1 showed that gullies commonly occur on slopes with high LS values. Slopes facing from east to south-east slightly
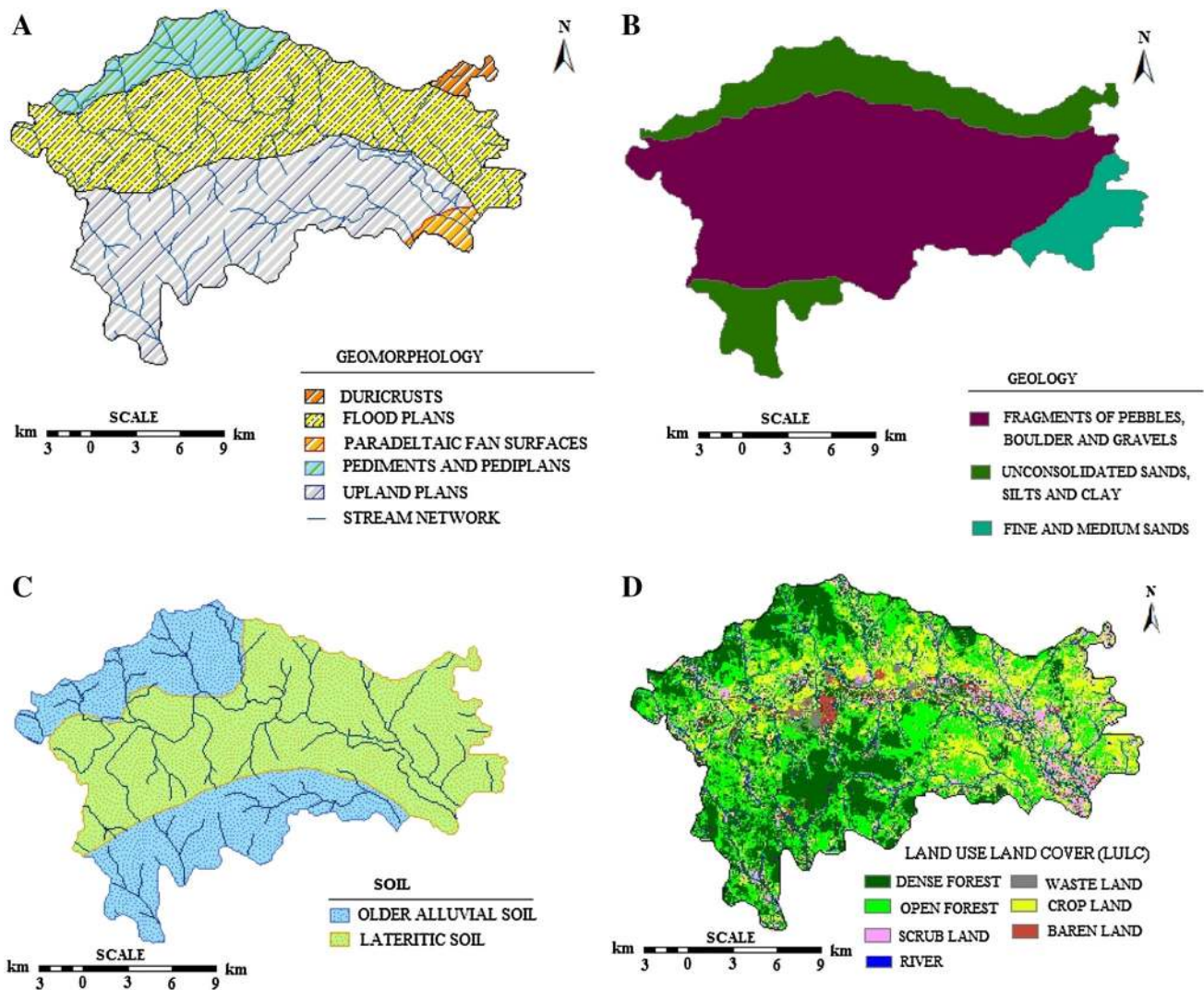
Fig. 3 Physical characteristic of the study area, **a** geology, **b** geomorphology, **c** soil and **d** land use and land cover

Table 2 Land use and land cover (LULC) characteristics and accuracy report of LULC of Garhbeta block

Class Name	Number of pixels	Area (in hectares)	Percent	Producer accuracy (%)	User accuracy (%)	Kappa^
Baren land	5476	48.072	1.347	66.67	100.00	1.00
Agricultural land	113,724	998.346	27.979	83.33	71.43	0.68
Scrub land	43,925	385.603	10.807	100.00	84.21	0.77
Dense forest	124,810	1095.666	30.707	88.89	100.00	1.00
Open forest	106,884	938.300	26.297	66.67	100.00	1.00
Waste land	9576	84.065	2.356	100.00	66.67	0.65
River	2060	18.084	0.507	80.00	100.00	1.00

Overall classification accuracy = 86.00 %

Overall kappa statistics = 0.8336

predominate. The slope of a terrain refers to the amount of inclination of physical feature or topographic landform to the horizontal surface. Our results reveals that areas with high LS (>4.00) favours gully erosion.

Topographical wetness index (TWI)

The study area has been classified into five categories of TWI (Fig. 4e). Results showed that the maximum values of
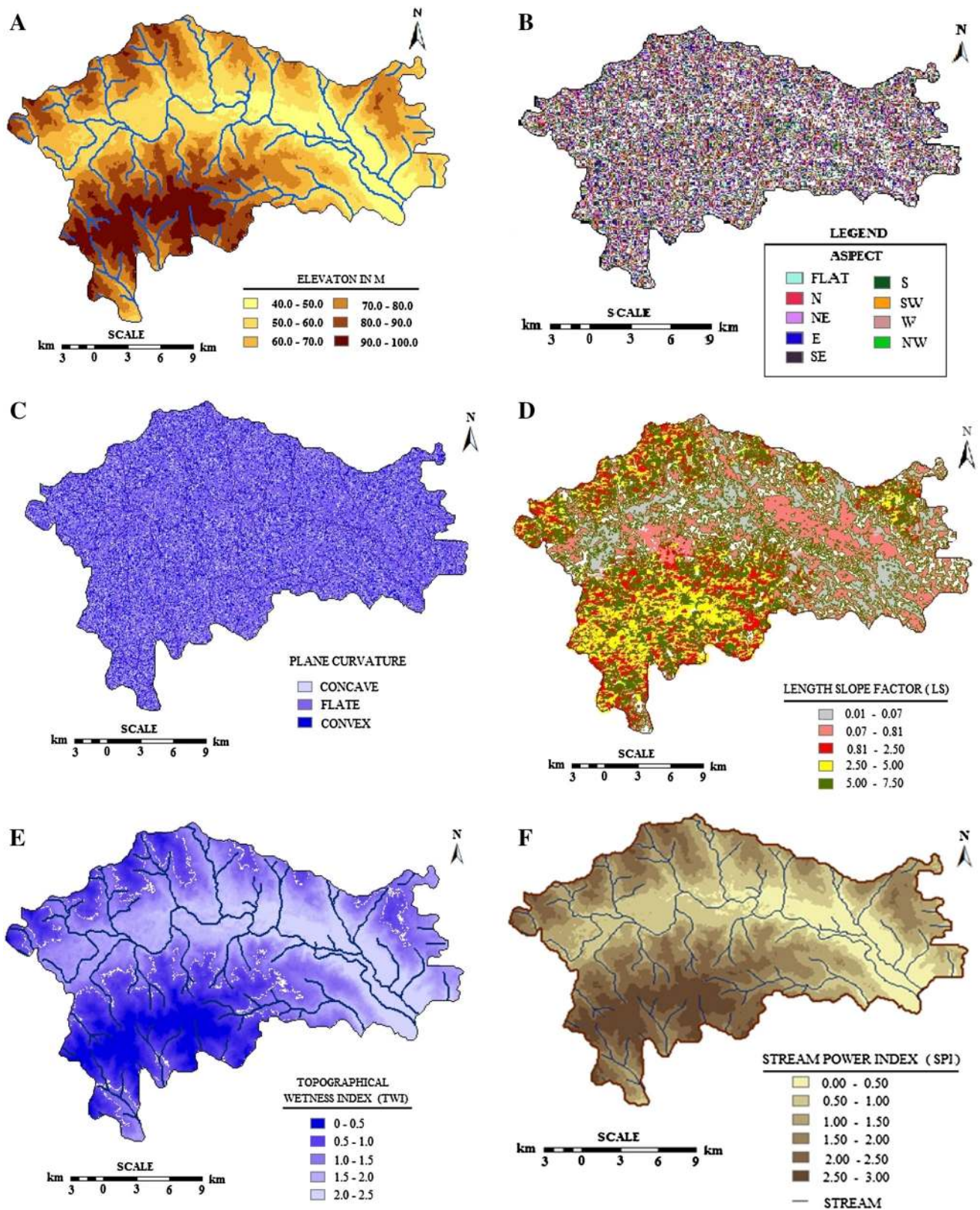
Fig. 4 Predisposing factors of gully erosion. **a** Elevation map; **b** land use land cover (LULC); **c** aspect map; **d** slope length factor (LS) map; **e** TWI map; and **f** SPI map

TWI index have been predominantly evidenced in valley bottoms, terraced surfaces and gentle slopes. The study area in Garbheta badland is particularly favoured in areas with high TWI values (>1.2). The higher value of TWI is portrayed in southwest and small pockets of northwest part.

Stream power index (SPI)

In the present research, values of SPI factor have been categorized into six classes. Table 1 showed that gully erosion processes normally crop up on slopes with high SPI values. The higher SPI value was recorded in the southwest, north and some small pockets of north-west part of the study area (Fig. 4f). Moreover, gully occurrence increases with an increase in SPI.

Gully erosion susceptibility map

Gully erosion susceptibility map of the study area is illustrated in Fig. 5. The index value of proneness ranges from 21.01 to 68.75. Based on the geometric interval, the study area has been divided into five categories: very low (less that 25.00), low (25.01–29.85), moderate (29.86–35.15), high (35.16–39.94) and very high (more
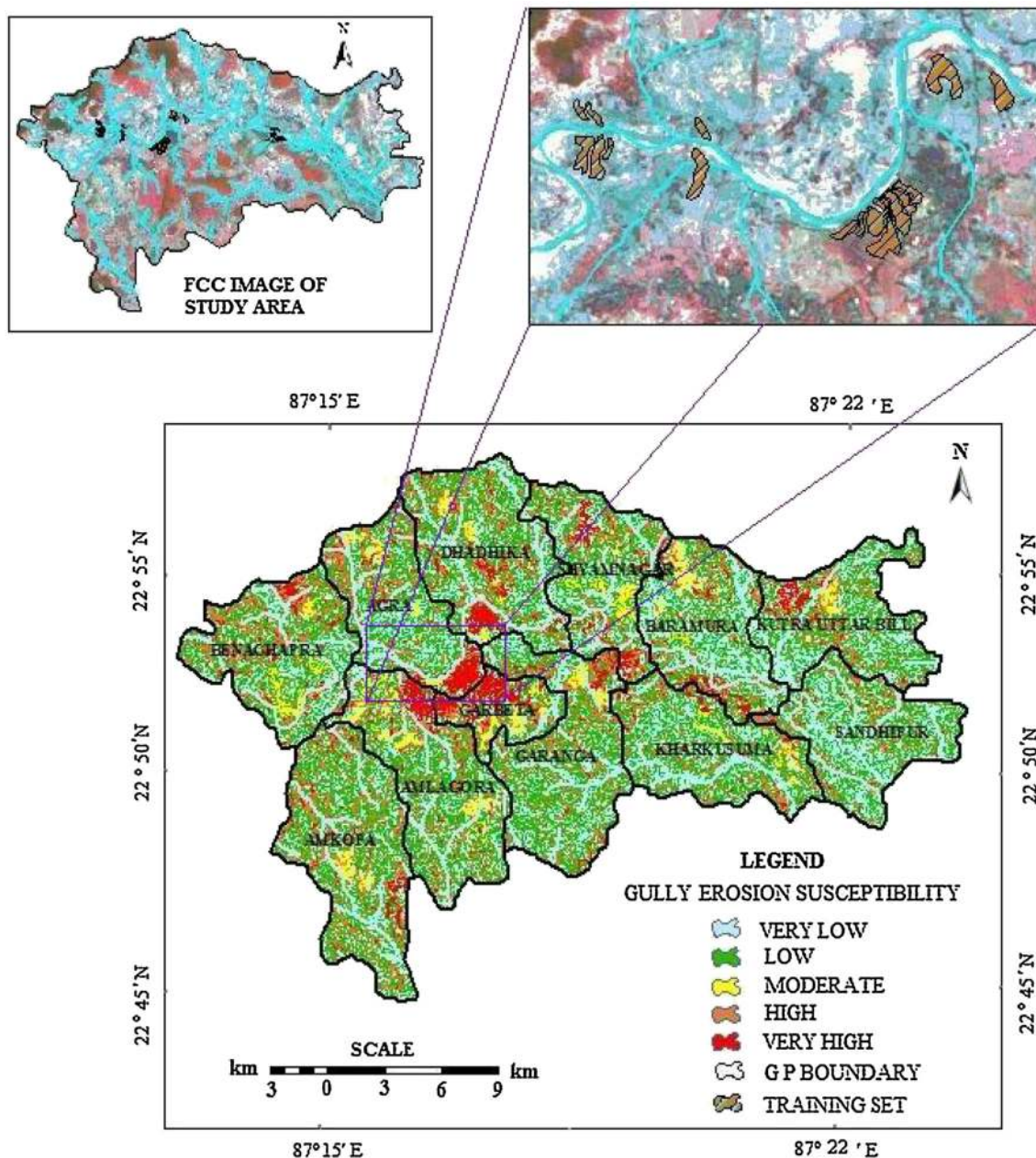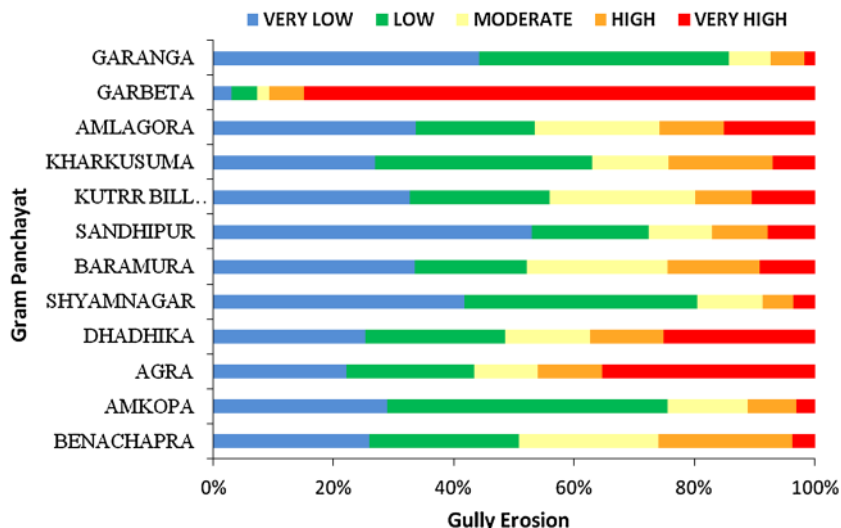

Fig. 5 Gully erosion susceptibility map of study area

Fig. 6 Gram Panchayat (GP) wise spatial distribution of gully erosion

than 39.95). Deep blue colour in the map shows high susceptibility, whereas light blue colour shows very low susceptibility.

The result presented in Fig. 6 showed that about 33.57 % (1197.82 hectares) of the study was classified as very low potential, 32.50 % (1159.79 hectares) as low potential, 13.99 % (499.03 hectares) as moderate potential, 10.30 % (367.41 hectares) as high potential and 9.64 % (344.05 hectares) very high potential gully proneness zone. The village level analysis reveals that 81.42 hectares (23.67 %) of the Garhbeta gram panchayat is under the very high gully proneness zone (Fig. 6). Agra gram Panchayat occupies 61.99 hectares (18.02 % of the total) of very high gully prone zone. Dhadhika and Amlagora gram panchayat showed 11.72 % (40.33 hectares) and 11.23 % (38.63 hectares) respectively of their area as very high gully prone. High risk of gully prone zone is chronicled at Kharkusuma and Benachapra. Moderate vulnerable areas of gully prone zone were noticed in Amlagora, Baramura and Benachapra. Garanga, Shyamnagar, Sandhipur and Amkopa are characterised with low to very low susceptibility of gully erosion.

Validation of gully hazard map

The derived gully hazard map has been validated through success rate and prediction rate curve (Fig. 7). Success rate curve is portrayed in red colour, while green line is represents prediction rate. These curves measure goodness of fit. In this study, areas under the curves of successive rate and prediction rates as 0.8285 and 0.7865, respectively; that indicate the succession and prediction rate are 82.85 and 78.65 % respectively. The result of our analysis also illustrate that the 9.65 % of very high susceptible area
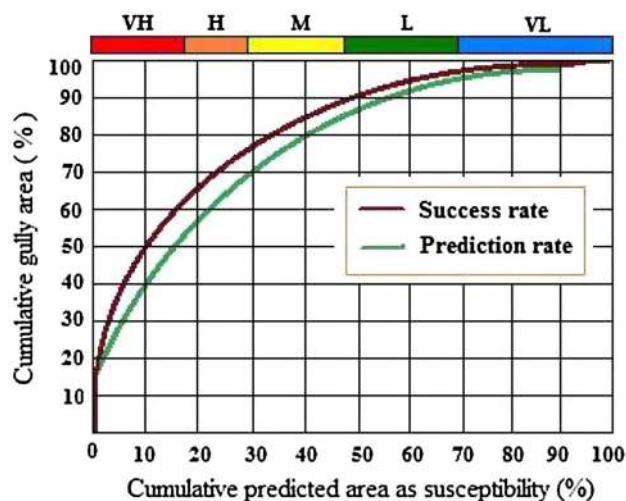

Fig. 7 Prediction rate and success rate curves that representing the accuracy of the susceptibility model of gully erosion

includes 51.25 % of the total subsidence area of success rate curve and 49.86 % of the prediction rate curve, while the 10 % high gully proneness area covers more than 72.00 %of the total gully area of success rate curve and 66.83 % of the prediction rate curve.

Discussion

Topographical variables are the important driving factors of gully erosion. Gully sidewall crack development is potentially one of the most influential factors causing sidewall instability and failure in present study area (Fig. 9) (Shit et al. 2013a, b). Our study showed taht gully

Fig. 8 Gully erosion processes in the Garbheta block. **a** Sidewall erosion, **b** gully widening, **c** active gully erosion during heavy rain events, **d** gully formed by retrogressive erosion with narrow and V-shaped channels, **e** badlands in the clayey lithology, **f** debris flow cones accumulated at the gully bottom of badlands channels

formation is often enhanced from June to September during monsoon period and with more than 20° slope gradient. However, the present result is corroborated with previous study carried out by Bandyopadhyay (1998) in other regions of West Bengal. Site-specific factors such as gully bank height, soil properties, and the length of the drying period affect crack development (Oostwoud Wijdenes and Bryan, 1994; Shit and Maiti 2012b). Results illustrated in our study identified the slope with >20°

having the maximum influence on gully occurrence. Field observations at Ganganir danga site indicated that much of the lateritic-exposed gully sidewalls are bounded by tension cracks, while sections exposing mineral sediment are free from cracking (Fig. 8). Both concentrated runoff, falls and topples are enhanced by the occurrence of desiccation cracks (due to shrink/swell dynamics of expandable clays) and tension cracks developed during dry seasons (Pulice et al. 2009). The presence of tension cracks on top of gully

Fig. 9 Gully erosion processes at Ganganir Danga badland **a** gully erosion along the silai river, **b** gully headcut and flank retreat processes, **c** spectacular landforms related to gully erosion, **d** narrow and deep vertical gully erosion, **e** earth pillar of gully erosion and **f** encroachment of gully in agriculture field

sides often tends to increase falling phenomena (Collison 2001; Bull and Kirkby 2002; Poesen et al. 2002; Shit and Maiti 2012a).

Steep slopes encourage high runoff velocity and resulting rill and gully initiation (Valentin et al. 2005). Slope analysis is an important parameter in morphometric studies (Gayen et al. 2013). Poesen et al. (2003) found that that critical drainage area or upslope contributing area (AS) needed for gully initiation decreases as slope steepens. Our results exhibited gully development largely depends on high AS values. Naturally, the areas with high AS values have attained the maximum values TWI (areas prone to become wet). The present information has been affirmed by the earlier study (BouKheir et al. 2007; Le Roux and Sumner 2012), representing zones of saturation with high surface soil water along drainage paths where AS is high and slope is low. These saturated areas favour gully formation since the surface soils lose their strength as they become wet. SPI indicates the catchment area of concentrated runoff (Morgan 1995) and thus the higher the SPI the higher the chance of a gully occurring.

The length-slope index (LS) also combines the effects of AS and slope. The gradient of slopes is one of the primary importance in the dynamics of the processes overriding land evolution; in fact, it affects surface runoff, drainage density, soil erosion, etc. (Rieke-Zapp and Nearing 2005; Conforti et al. 2011). Fluvial undercutting and the consequent collapse of gully sidewalls cause dilatation (pressure release) crack development and exposes under rocks. However, during heavy rain events, many gullies reactivate and, in addition to vertical dissection, may frequently undergo headcut and valley-side retreat processes causing lengthening, deepening and widening of gullies (Fig. 9). In the present analysis, high proportion of gullied were found in high LS areas. It may be due to the generation of sufficient runoff (high AS) with a sufficient level of relief energy (Desmet et al. 1999).

Fragments of pebbles, boulder and gravels are the most widespread lithologies in the area under study. Unconsolidated sand, silt and clays crop out for the 12 % of the study area and mostly in the northern and extreme southern zone. Fine and medium sands mainly outcrop in the southeast pocket of the basin reaching about 3 % of the basin. Tamene et al. (2006) reported that the inherent erodibility of the parent material (Geology) as the overriding gully erosion risk factor. In Garbheta various lateritic/sandstones were susceptible to gully erosion mainly due to highly erodible soils.

Gully erosion is often triggered by appropriate land use characteristics. Field observations indicated that a relatively large portion of the cultivated and scrub areas in the catchment are affected by gully erosion due to livestock disturbance, including overgrazing and trampling along cattle tracks. Present results also corroborated with the previous study conducted by Boardman and Foster (2008); Gómez Gutiérrez et al. (2009a, b).

The analysis illustrated that both the curves have very analogous shape, viewing an elevated gradient in the earliest part and smoothly lessen monotonically. However, this analysis also proves strong spatial relationship between influential factors used in the present analysis. Moreover, the validation method demonstrates that the projecting power of the model is accurately portrayed in high and very high risk areas.

Conclusions

This study aimed to identity the most influential factors of gully erosion and to delineate susceptible zone based on bivariate statistical method and geospatial technology. The analysis performed has revealed that various factors have different influence on gully development. Our results suggested that topographical factors and land use characteristics played an imperative role on gully occurrence in Garhbeta block (Paschim Medinipur, West Bengal, India). Moreover, for each factor, only some classes were found to play a very important role in the development of gully. The most contributing classes to gully occurrences were found to be: lateritic soil, concave slope, fragmentation of pebbles, boulders and gravels, elevation (70–90 m), stream power index (2.00–3.00), slope of length (2.50–7.50), TWI (2.0–2.5), waste and barren land areas. Our results confirm that the high value of the gully proneness map demonstrated reasonable concurrence with the gully site data.

As such, the proposed model helps to decision makers to delineate the high and low susceptible areas in relation to gully erosion and to develop suitable soil and water conservation practices. The prediction rate curve portrayed satisfactory agreement between the gully erosion prone map and gully location data obtained from the field. This methodology can also be used in the other areas to delineate the gully susceptible zone.

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