

Sediment Yield Simulation in Upper Ayeyarwady Basin

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Abstract

This study was undertaken to examine the applicability of Soil and Water Assessment Tool (SWAT) model for the Upper Ayeyarwady Basin for simulating sediment yield. The SWAT model is hydro-dynamic and physically-based model for the application in complex and large basins. The required input data for this study were Digital Elevation Model (DEM) with spatial resolution of 30 m x 30 m, land use/land cover map and soil map. And also the hydro-meteorological data around the basin were used. The model has been calibrated and validated using observed sediment data of eight years at the basin outlet (Sagaing). The automated calibration process was used to calibrate the model parameters using time series data from 2003 to 2007. Data from 2008 to 2010 were used to validate the model using the input parameter set. The model predicted the annual sediment in the watershed as 272.8 million ton per year. The average annual values of sediment yield for Nash-Sutcliffe efficiency (NSE) and R^2 were found to be 0.89 and 0.82, respectively for calibration and 0.88 and 0.80, respectively for validation, which were within the allowable limit.

Keywords: MUSLE; Sediment yield; SWAT; Watershed delineation.

1. Introduction

Sediment yield is the amount of erosional debris from drainage basin deposited in river. Sediment yield increases with increasing annual rainfall and drainage basin slope and its magnitude depends upon the nature of surface material. This study was the evaluation of sediment yield for the upper Ayeyarwady basin. Ayeyarwady River is largest river in Myanmar. It has been affected by several soil erosion which contributes to a high sediment load.

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There are many models for predicting and estimating sediment yield. The sediment yield model that is used in this study is the Soil and Water Assessment Tool (SWAT) model. Input data of the SWAT model were prepared using remote sensing (RS), geographical information system (GIS) and image processing software. Sediment yield is estimated for each Hydrologic Response Units (HRUs) with the Modified Universal Soil Loss Equation (MUSLE). The purpose of this study was to examine the applicability of the soil and water assessment tool (SWAT) model in estimating the sediment yield in the upper Ayeyarwady basin.

2. Description on Study Area

The Ayeyarwady River is one of the great rivers in Asia. It flows through the heartlands of Myanmar. It is the fifth largest river in the world in terms of sediment discharge. It is conventionally divided into two basins; Upper and Lower Basin. Only upper part of the river is modeled in this study. The upper basin starts from its source to the river confluence with the Chindwin River. In the Upper Basin, the tributaries of Ayeyarwady River joining it from left are Mu River whereas Shweli River, Tapaing River and Myitnge River join from Right. The upper Ayeyarwady basin extends between latitudes 20°22' N to 28°31' N and longitude 94°45' E to 98°56' E. From a physical point of view, the study area is covered by Kachin State, western part of Shan State, Mandalay Division and south eastern part of Sagaing Division. The watershed has an area of 169,917 km² and 25 subbasins. Figure 1 shows the location map of study area.

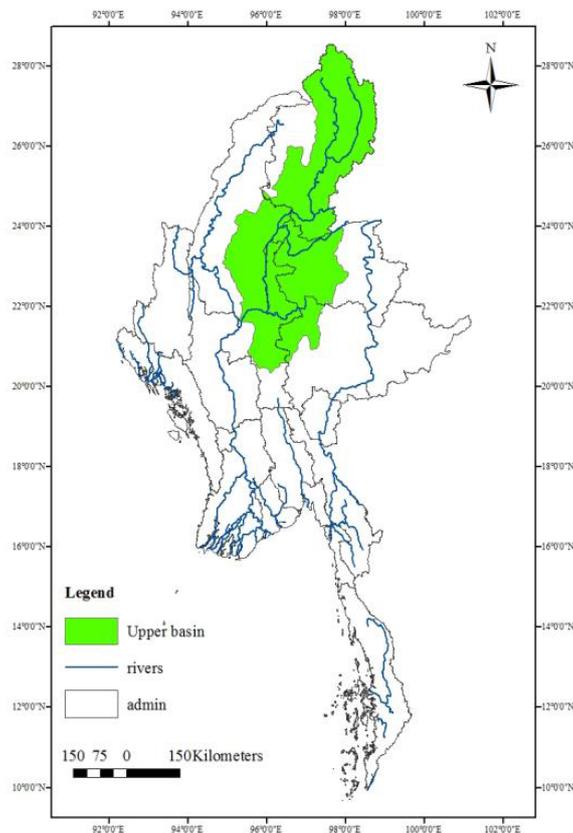


Figure 1: location map of upper Ayeyarwady basin

3. Methodology

In order to estimate the sediment yield, there are many hydrologic models. The GIS-based software Soil and Water Assessment Tool (SWAT) model with the version of 2012 was used to calculate sediment load in this study. The model predicts the hydrology at each HRU using the water balance equation which includes daily precipitation, runoff, evapotranspiration, percolation, and return flow component [3]. The following sections describe the brief description of SWAT model and model inputs.

3.1 Description of SWAT Model

SWAT is a river basin, or watershed scale model developed by Jeff Arnold for the USDA Agricultural Research Service (ARS). SWAT is a daily time step, hydrologic simulation model that simulates the impacts of climate, land use, and land management in a watershed, which is usually divided into several subbasins. It was developed to predict the impact of land management practices on water, sediment and agricultural chemical yields in large complex watersheds with varying soils, land use and management conditions over long periods of time. It is a physically based model which requires specific information about weather, soil properties, topography, vegetation and land management practices occurring in the watershed. In the SWAT model, the watershed is divided into a number of subbasins. Subbasins further partitioned into Hydrologic Response Units (HRUs) based on soil types, land use and slope classes. The simulation of sediment yield is computed with the MUSLE (Williams, 1995):

$$Y = 11.8 \times (Q \times q_p)^{0.56} \times K \times LS \times C \times P \quad (1)$$

where Y is the sediment yield in tones, Q is the surface runoff volume in cubic meter, q_p is the peak flow rate in cubic meters per second, K is the soil erodibility factor, LS the slope length and gradient factor, C is the land cover and management factor and P is the support practice factor.

3.2 Model Inputs

The version of SWAT used in this study was SWAT 2012, which requires an ArcGIS interface to perform initial model configuration. This model requires three GIS maps such as Digital Elevation Model (DEM), land cover/land use map and soil map.

3.2.1 Digital Elevation Model (DEM)

DEM is one of the main inputs in the SWAT model. It was used to identify different basin characteristics such as drainage area, elevation, slope steepness, slope length and streams relief ratio. In this study, the DEM map was extracted from ASTER (Advanced Space borne Thermal Emission and Reflection Radiometer) GDEM (Global Digital Elevation Model) with a spatial resolution of 30 m. The elevation of the study area ranges from 6705 m to 551 m. The DEM was used to delineate the boundary of the watershed and analyze the drainage patterns of the land surface terrain. Terrain parameters such as slope gradient and slope length, and stream network characteristics such as channel slope, length and width were derived from the DEM. DEM map of the

upper Ayeyarwady basin is shown in Figure 2.

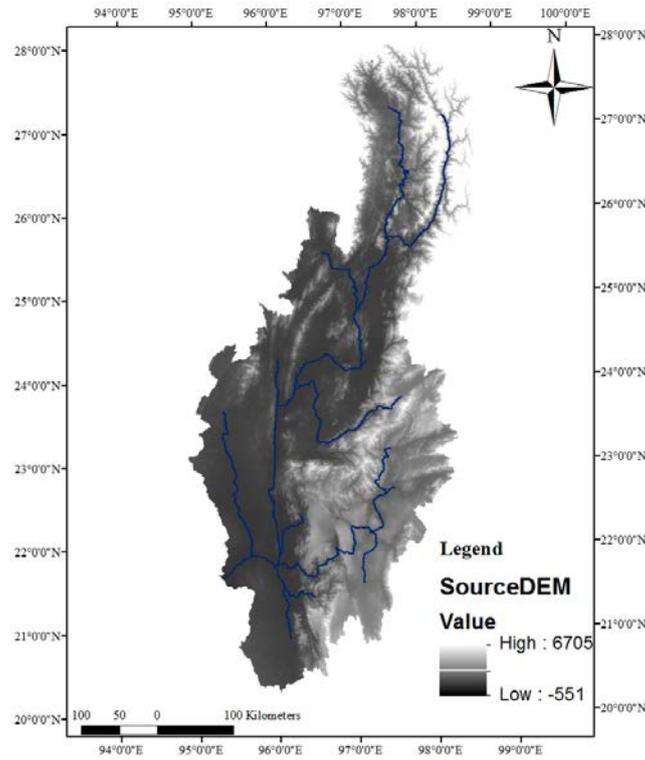


Figure 2: digital elevation model (DEM) of the study area

3.2.2 Land Use/Land Cover Map

The original land use data obtained from a land use map of 2010 was reclassified and naming used by ArcSWAT hydrologic model. The major land use classes of the study area are presented in Table 1 and shown in Figure 3.

Table 1: Major land use classes in upper Ayeyarwady basin

Land use	Area (ha)	% Total
Agricultural land	2856.3	16.81
Scrubland	4640.4	27.31
Waterbody	15.3	0.09
Evergreen Forest	5882.5	34.62
Deciduous Forest	3597.2	21.17
Total	16991.7	100.00

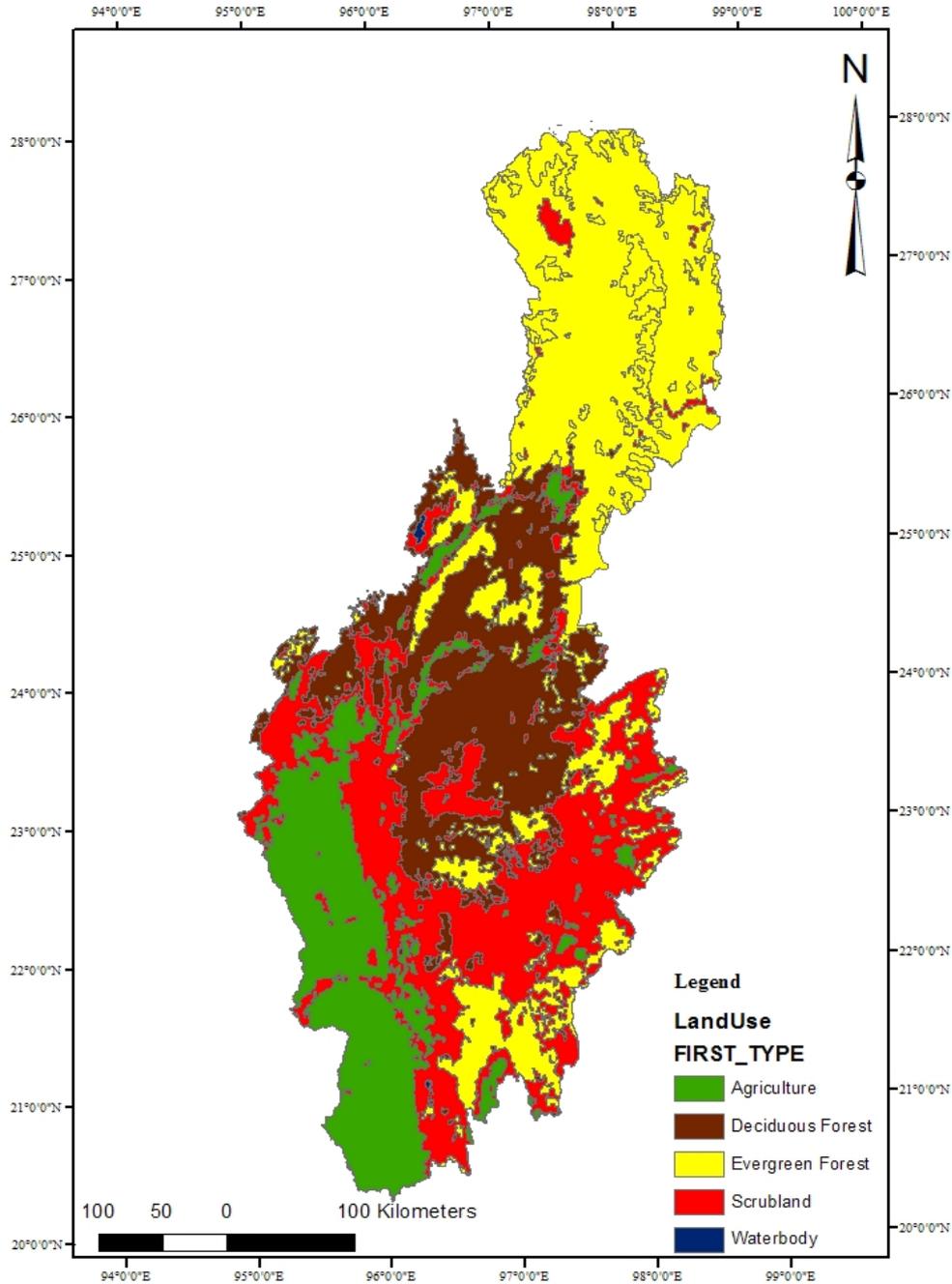


Figure 3: land use map of upper Ayeyarwady basin

3.2.3 Soil map

The digitized soil map was used in SWAT and the soil properties for different layers were fed as the input data for the soils. The basin under this study has six types of soil, namely meadow & meadow alluvial soil, mountainous brown forest soil, savanna soil in slopes, red earth & yellow earth, red brown forest soil and waterbody. The soil types in this watershed are converted to hydrologic soil group: Group A (31.79%), Group B (24.06%), Group C (11.68%), Group D (30.56%) and waterbody (1.91%). This hydrologic soil group map is

shown in Figure 4.

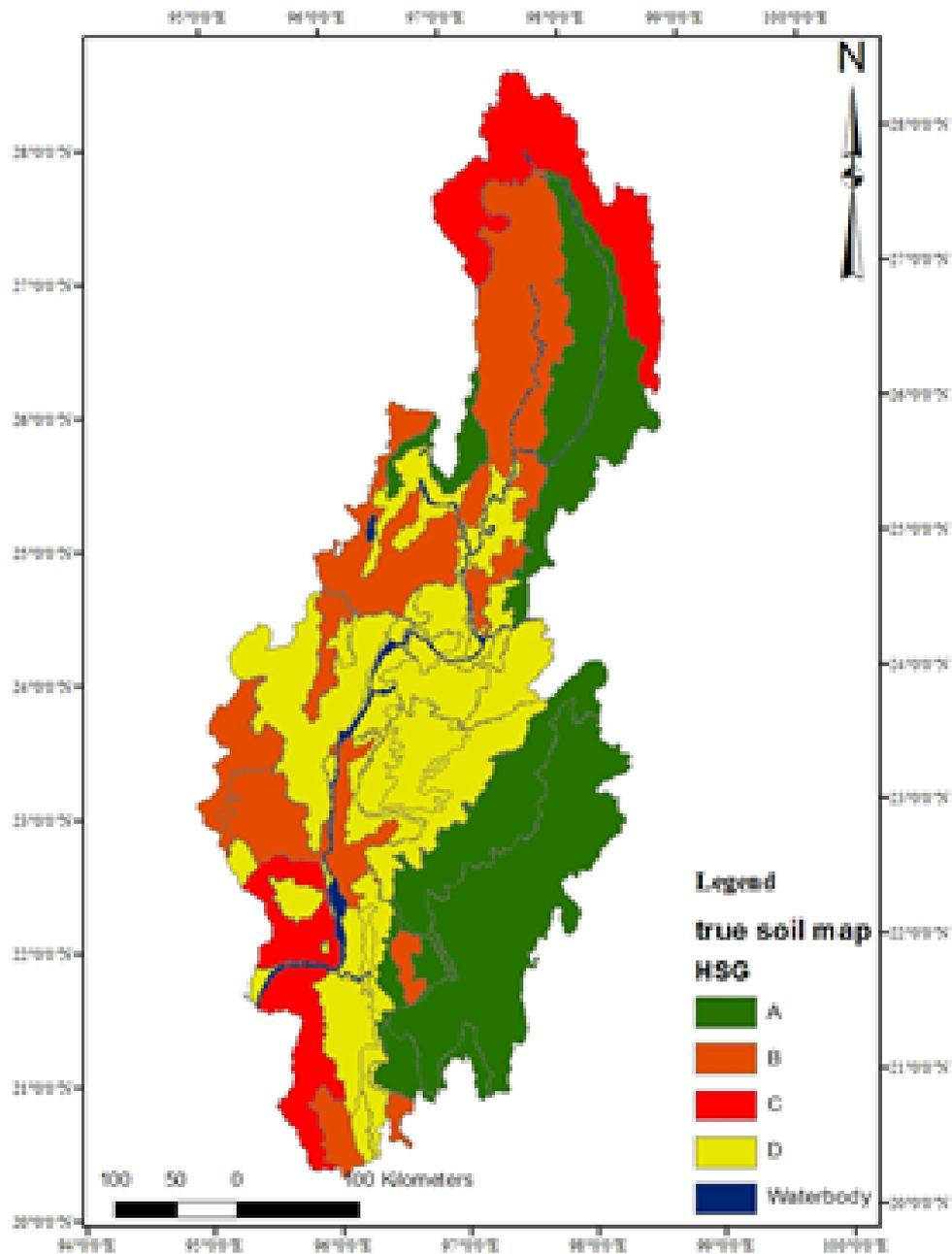


Figure 4: hydrologic soil group map of upper Ayeyarwady basin

3.2.4 Meteorological data

Meteorological data is needed by the SWAT model to simulate the hydrological conditions of the basin. The weather variables required by the SWAT model for driving the hydrological balance are daily rainfall and minimum and maximum temperatures. These data were obtained from Department of Meteorology and Hydrology. Based on duration and data quality of meteorological monitoring stations in upper Ayeyarwady

basin, weather data are available from nine gages as Putao, Myitkyina, Katha, Mandalay, Sagaing, Homalin, Loilen and Kengtung.

3.2.5 Hydrological data

The observed daily runoff and sediment yield data at the outlet of the watershed were obtained from the Department of Hydrology. These data are required for calibration and validation of the SWAT model. The location map of rainfall stations and discharge stations within the basin is shown in Figure 5.

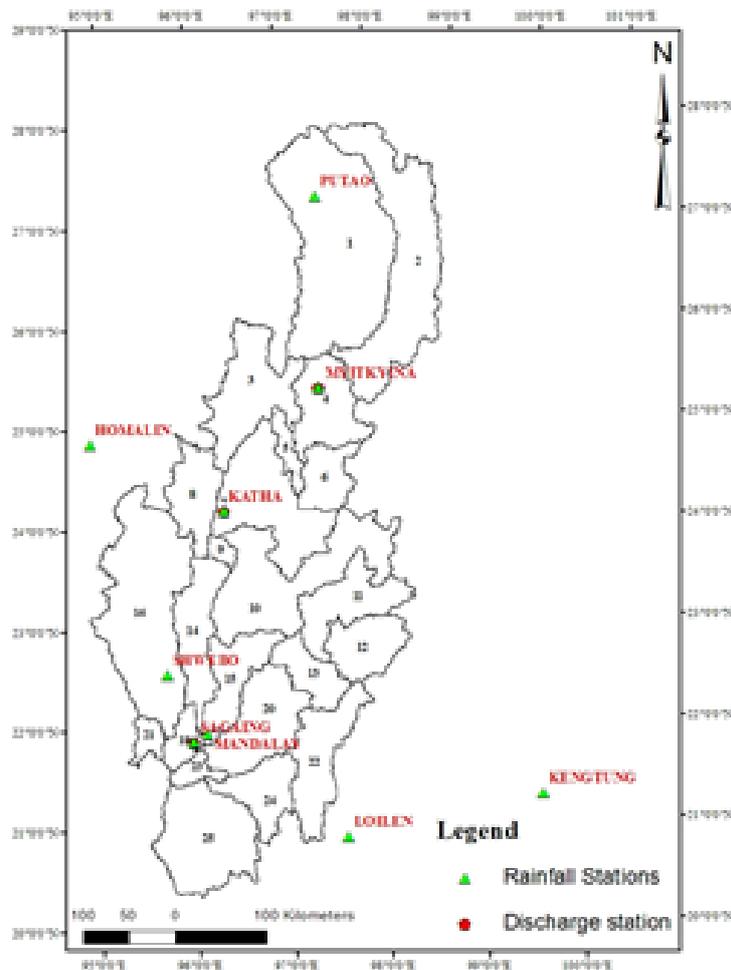


Figure 5: location map of rainfall and discharge stations

3.2.6 Model set-up

The Arc-SWAT2012 is an ArcView extension. It provides a graphical user interface that allows for GIS data to be easily formatted for use in SWAT model simulations [5]. ArcSWAT breaks preprocessing into four main steps: watershed delineation, HRU analysis, weather data definition and SWAT simulation. The first step in DEM processing is removal of errors from DEM which is achieved by using fill sinks method. The next step is

DEM hydro processing which involves the estimation of flow accumulation, flow direction and slope, etc. The upper Ayeyarwady basin with the outlet at Sagaing has been delineated according to elevation data derived from the global digital elevation model. The hydrologic response units (HRUs) have been defined based on land use categories, soil properties and slope characteristics. The watershed was delineated into 25 subbasins and 63 HRUs.

3.3 Model calibration and validation

The first step in the calibration and validation process in SWAT is the determination of the most sensitive parameters for a given watershed or subwatershed. Sensitivity analysis is the process of determining the rate of change in model output with respect to changes in model inputs (parameters). The second step is validation for the component of interest (stream flow, sediment yields, etc.). Validation involves running a model using parameters that were determined during the calibration process and comparing the predictions to observed data not used in the calibration [1]. The observed daily runoff and sediment yield data at the outlet of the watershed were obtained from the Department of Hydrology. These data are required for calibration and validation of the SWAT model.

4. Results and Discussions

As a result, average annual sediment production in the watershed was 272.8 million tons per year. The sediment yields for each month for the period of 2003 to 2010 are shown in Figure 6 and Table 2. Monthly sediment yield at the outlet of the study area watershed was simulated for the whole watershed. Months of June, July, August, September and October resulted in greater sediment load delivered into the basin. Total sediment yield for each of the 25 subbasins is shown in Figure 7. The highest sediment yields were recorded in subbasins 15, 16, 25 and 9 with values of 6867.2, 5903.7, 5553.3 and 4212.6 t/ha respectively. Lowest sediment yields were obtained in subbasins 2, 20, 11, 22, 13 and 24 with values of 2, 2.7, 4.8, 5.3, 5.6 and 8.2 t/ha respectively. And then, the annual result of the sediment yield for the watershed is shown in Figure 8.

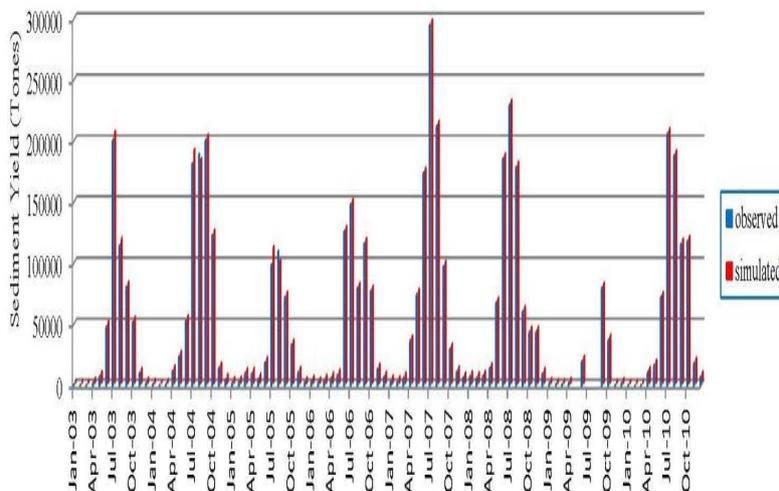


Figure 6: monthly sediment yield for the upper Ayeyarwady basin

Table 2: Monthly sediment yield for the upper Ayeyarwady basin (Tones)

Time	Observed	Simulated	Time	Observed	Simulated
Jan-03	1067	1102	Jan-07	4114	4528
Feb-03	974	1003	Feb-07	3785	3961
Mar-03	830	945	Mar-07	6837	7065
Apr-03	2621	2834	Apr-07	37201	37462
May-03	7990	8234	May-07	75148	75368
Jun-03	48349	49623	Jun-07	174660	174836
Jul-03	201491	204863	Jul-07	295953	296107
Aug-03	115162	117421	Aug-07	212933	213153
Sep-03	81047	81591	Sep-07	97958	98283
Oct-03	52438	52762	Oct-07	30483	30684
Nov-03	10469	10623	Nov-07	11569	11749
Dec-03	2666	3013	Dec-07	6968	7132
Jan-04	1327	1645	Jan-08	7898	7986
Feb-04	669	789	Feb-08	6736	6945
Mar-04	1354	1567	Mar-08	8076	8392
Apr-04	12345	12735	Apr-08	14710	14937
May-04	24261	24682	May-08	68290	68403
Jun-04	53542	53874	Jun-08	186035	186256
Jul-04	182217	189945	Jul-08	230303	230536
Aug-04	189801	182431	Aug-08	179234	179579
Sep-04	201613	201976	Sep-08	61314	61482
Oct-04	123533	123932	Oct-08	44311	44621
Nov-04	14919	15018	Nov-08	44311	44621
Dec-04	5240	5835	Dec-08	10246	10562
Jan-05	2556	3124	Jan-09	2271	2483
Feb-05	3346	3681	Feb-09	1380	1586
Mar-05	10435	10756	Mar-09	1274	1363
Apr-05	10383	10681	Apr-09	2657	2735
May-05	5739	5972	May-09	2918	3086
Jun-05	19225	19547	Jun-09	20448	20573
Jul-05	99685	110581	Jul-09	98099	130625
Aug-05	110373	99754	Aug-09	130510	98257
Sep-05	73022	73216	Sep-09	80586	80738
Oct-05	33896	34045	Oct-09	37765	37935
Nov-05	11257	11482	Nov-09	888	972
Dec-05	2979	3142	Dec-09	2329	2468

Jan-06	4169	4372	Jan-10	851	912
Feb-06	2845	2986	Feb-10	420	548
Mar-06	4855	5036	Mar-10	837	903
Apr-06	6611	6872	Apr-10	11347	11473
May-06	9100	9428	May-10	17368	17586
Jun-06	126628	126943	Jun-10	72898	72975
Jul-06	149106	149367	Jul-10	206841	207023
Aug-06	80412	80518	Aug-10	188768	188954
Sep-06	116838	117102	Sep-10	116202	116483
Oct-06	77942	78023	Oct-10	118660	118971
Nov-06	13930	14104	Nov-10	18951	19104
Dec-06	7519	7735	Dec-10	7625	7864

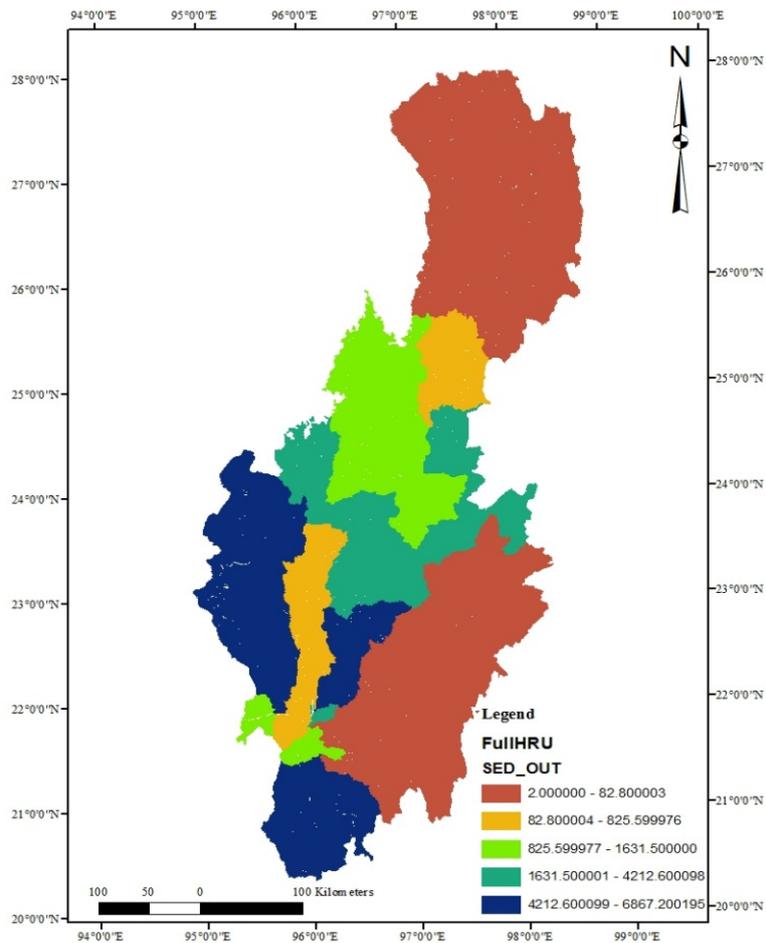


Figure 7: annual sediment yield for each of the subbasins in the watershed

Table 5

Subbasins	Area (ha)	Sediment (ton/ha)
1	2327.3	2
2	1689.5	82.8
3	881.1	1462.6
4	632.7	400.9
5	155.5	1035.7
6	364.2	3847.2
7	1093.2	1210.4
8	501.1	3236.4
9	73.8	3268.5
10	1390.6	2877.6
11	629.9	4.8
12	483.0	21.5
13	364.9	5.6
14	621.1	825.6
15	498.0	6867.2
16	1822.7	5903.7
17	37.5	3164.8
18	175.5	705.1
19	0.3	4212.6
20	792.8	2.7
21	128.0	1631.5
22	697.5	5.3
23	126.1	1520.4
24	457.1	8.2
25	1048.3	5553.3

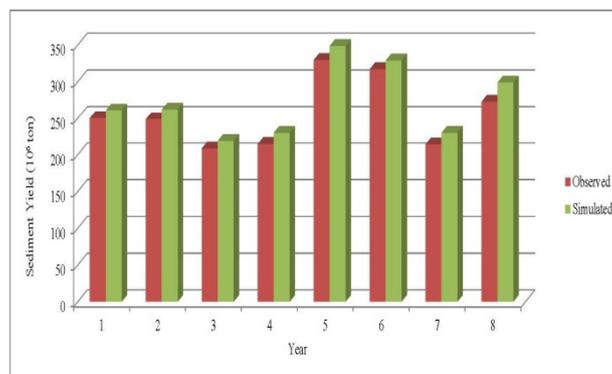


Figure 8: annual sediment yield for the upper Ayeyarwady basin

Table 6

Year	Sediment (10^6 Tones)	
	Observed	Simulated
2003	250.251	260.976
2004	248.586	261.985
2005	208.767	218.998
2006	214.667	229.986
2007	329.697	348.995
2008	317.228	328.978
2009	214.2593	229.977
2010	272.945	298.985

4.1. Sediment calibration and validation

SWAT model was also calibrated in this study using a time series dataset of eight years from 2003 to 2010 and found to be a good predictor of sediment loads into the watershed [2]. The first two years of the modeling period were used for 'model warm-up'. Data for the period 2003 to 2007 were used for calibration and the remaining part of the dataset was reserved for validation.

The sediment yield from a watershed is associated with the complicated interaction between land use, soil, vegetation and topography [4]. The sediment parameters contemplated during the calibration were the USLE cover factor (USLE_C), the coefficient in the sediment transport equation (SPCON), the channel cover factor (Ch_COV) and the channel erodibility factor (Ch_COV2).

These parameters were adjusted to particular levels in different iterations where they were able to signify the features of the present land use and topography of the watershed. Overall, the performance of the model for the sediment modeling was efficient. The R^2 and NS values were 0.82 and 0.80; respectively during the calibration period. For the validation period, R^2 and NS values were 0.80 and 0.78; respectively, which demonstrate the model closely predicted the observed values of sediment yield. Parameter values for sediment calibration are shown in Table 3.

The calibration and validation results of monthly and annual observed and simulated sediment yield is shown in Table 4.

The results of calibration have been reported the values of R^2 are 0.82 and 0.89 for monthly and annual, respectively for calibration and 0.80 and 0.88 for monthly and annual validation. The values of Nash and Sutcliffe efficiency (NSE) for monthly and annual were found to be 0.80 and 0.87 for calibration and 0.78 and 0.80 for validation, respectively. Therefore, it can be seen that the annual comparison indicate a better correlation than the monthly values.

Table 3: Parameter values for sediment calibration

Parameter	Name	Range	Final Value
Ch_COV	Channel cover factor	0.05~0.6	0.5
Ch_COV2	Channel erodibility factor	0.001~1	0.18
SPCON	Linear parameter for calculating the maximum amount of sediment	0.0001~0.01	0.0025
USLE_C	USLE cover factor	0~0.1	0.02

Table 4: Calibration and validation results of monthly and annual observed and simulated sediment yield

Parameter	Time	Calibrated	Validated
		(2003-2007)	(2007-2010)
Correlation coefficient (R^2)	Monthly	0.82	0.80
	Annual	0.89	0.88
Nash and Sutcliffe efficiency (NSE)	Monthly	0.80	0.78
	Annual	0.87	0.80

6. Conclusions

The study has demonstrated how the integration of SWAT model, Remote Sensing and GIS can be a powerful tool in simulating watershed variables such as the sediment yield of a large river basin. Sediment yield is an important measure of geomorphic activity which represents the amount of sediment exported at the basin outlet over a period of time. This study was carried out for the upper Ayeyarwady basin. The SWAT model MUSLE was used to estimate the sediment in the basin. DEM, land use map, soil map and weather data were used in this analysis. The study area was divided into 25 subbasin and 63 HRUs. In this study, the parameters of SWAT model have been calibrated (period 2003-2007) and validated (period 2008-2010) for estimation of sediment yield at the outlet of the upper Ayeyarwady basin.

The results of calibration have been reported the values of R^2 are 0.82 and 0.89 for monthly and annual, respectively for calibration and 0.80 and 0.88 for monthly and annual validation. The values of Nash and Sutcliffe efficiency (NSE) for monthly and annual were found to be 0.80 and 0.87 for calibration and 0.78 and 0.80 for validation, respectively. It can be seen that the annual comparison indicate a better correlation than the monthly values. The using of SWAT model for this study is able to predict sediment yield values, which might be beneficial for future planning and management.

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