Assessment of the Impact of Agricultural Land Cover Changes in Aklan River Watershed, Philippines using SWAT+

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Presentation Overview





Introduction



Introduction

Soil erosion, a pressing problem of Aklan River Watershed

"The Aklan river watershed, situated within the Aklan province of the Philippines, significantly contributes to the prevalent soil erosion challenges due to its rugged terrain, inadequate vegetation cover, and improper land utilization practices"

Señeris et al., 2024





Introduction

HYDROLOGIC REGIME

Streamflow, erosion, and sediment transport in a watershed is mainly the product of existing climate, land cover, soil, and topography.



The extent, arrangement, and how land cover is practiced determines the timing, amount, and occurrence of hydrologic processes and consequently affects soil condition and water resources.



"Land cover changes significantly affect sediment yield..." (Principe, 2012)

"Sedimentation in river basins should be closely monitored due to its negative effects on the riverine and coastal biodiversity and the surrounding community in the area" (Principe and Blanco, 2014)



"Sediment yield simulations and scenario analysis can serve as an additional tool for the formulation of conservation policies in the locality." (Arizobal et al., 2024)



Significance of the Study



The results of this research are expected to provide a scientific basis for local government units, environmental planners, and community stakeholders to develop data-driven policies for watershed conservation and land use planning.

It also provides insights that can inform the implementation of nature-based solutions and best management practices in the agricultural sector.



Objectives of the Study

The main objective of this study is to provide an assessment of the impact of agricultural land cover changes on streamflow and sediment yield in the Aklan River Watershed using SWAT+.

Specifically, it aims:

1. To utilize, adapt, and calibrate the Soil and Water Assessment Tool+ (SWAT+) model to assess the streamflow of the Aklan River Watershed;

2. To assess the effects of different agricultural land cover scenarios on sediment yield in the Aklan River watershed using the SWAT+ model; and

3. Identify potential management options based on SWAT+ simulation results.



Methodology



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Location of the Study Area



- Covering a massive area of about 87,877.98 hectares.
- This watershed traverses four provinces in Panay-Aklan, Antique, Capiz, and Iloilo, and includes a total of sixteen barangays.



SWAT Model Components and Methodology



| Data | Sources |
|---------------------------------------|--|
| Digital Elevation Model (DEM) | US Geological Survey- Shuttle Radar Topography Mission (USGS-SRTM) |
| Land Cover Maps (2010, 2015, 2020) | National Mapping and Resources Information Authority (NAMRIA) |
| Soil Map | Food and Agriculture Organization- Digital Soil Map of the World (FAO-DSMW) |
| Climate Data (1960-2023) | Department of Science and Technology- Philippine Atmospheric, Geophysical and Astronomical Services Administration (DOST-PAGASA) |

Watershed Delineation

HRU Definition

(Land Cover)



Digital Elevation Model

Conversion of Land Cover into SWAT Class

| Land Cover (NAMRIA) | Number | Land use | Detail |
|------------------------|--------|----------|---------------------------------|
| Annual Crop | 1 | AGRL | Agricultural land- generic |
| Brush/Shrubs | 2 | RNGB | Shrub and Brush Rangeland |
| Built-up | 3 | URMD | Residential |
| Closed Forest | 4 | FRST | Mixed Forest |
| Fishpond | 5 | WATR | Water |
| Grassland | 6 | RNGE | Range-grasses |
| Inland Water | 7 | WATR | Water |
| Mangrove Forest | 8 | WETF | Wetlands-forested |
| Open Forest | 9 | FRSD | Forest-Deciduos |
| Open/ Barren | 10 | BARR | Barren |
| Perennial Crop | 11 | AGRR | Agricultural land- row crops |

Source: https://oldgeni.isnew.info/landuse.html



Soil Lookup Table

| Value | Soil |
|-------|----------------|
| 4465 | Ao109-2-3-4465 |
| 4413 | Nd66-2-3b-4413 |
| 4589 | Vp65-3a-4589 |
| 0 | WATER-6997 |

User soil

| OBJECTID | MUID | SEQN | SNAM | S5ID | CMPPCT | NLAYERS | HYDGRP | SOL_ZMX | ANION_EX | SOL_CRK | TEXTURE | SOL_Z1 |
|----------|------|------|-----------|------|--------|---------|--------|---------|----------|---------|----------|--------|
| 2911 | 0 | 4465 | Ao109-2-3 | 0 | 0 | 2 | C | 770 | 0.5 | 0.5 | LOAM | 300 |
| 2871 | 0 | 4413 | Nd66-2-3b | 0 0 | 0 | 2 | D | 1000 | 0.5 | 0.5 | CLAY_LOA | 300 |
| 3016 | 0 | 4589 | Vp65-3a-4 | 0 | 0 | 2 | C | 1000 | 0.5 | 0.5 | CLAY | 300 |
| 4931 | 0 | 6997 | WATER-69 | 0 | 0 | 1 | D | 25.4 | 0.5 | 0.5 | WATER | 25 |



Temporal Data Sets

Location: Roxas City Capiz Station

Latitude 11.600265° North and longitude 122.749621° east, with a ground elevation of 2.495 meters above sea level

| Meteorological Data | Unit |
|---|-----------|
| Precipitation | mm |
| Temperature a. TMAX (Maximum Temperature) b. TMIN (Minimum Temperature) | °C |
| Relative Humidity | % |
| Wind Speed | m/s |
| Solar Radiation | Simulated |

Source: Department of Science and Technology- Philippine Atmospheric, Geophysical, and Astronomical Services Administration



Temporal Data Sets

| Hydrological Data | Unit |
|-------------------|-----------------------------------|
| Streamflow | Daily (l/s) |
| Location | Bgy. Libtong, Kalibo, Aklan |
| Gauging Station | Latitude 11°41'56" and 122°21'47" |
| Calibration | 2007-2012 |
| Validation | 2013-2018 |

Source: Bureau of Design, Department of Public Works and Highways (DPWH)

SWAT+ Calibration, Validation, and Sensitivity Analysis

- > SWAT Simulation= 12 years (2007-2018)
- ➤ Warm-up or Equilibration Period= 4 years (2007-2008; 2013-2014)
- ➤ Calibration= January 2007 to December 2012
- Validation= January 2013- December 2018

| | Units | | Calibration | | Validation | |
|----------|----------------------|-----------|----------------------------|-------|------------|----------|
| Variable | Original Model Input | | Iodel InputPeriodTime Step | | Period | Timestep |
| Flow | li/s | m^{3}/s | 2007-2012 | Daily | 2013-2018 | Daily |

Source: DPWH-Streamflow Management System

Note:

- 1. The observation files should be in CSV format with two columns- date (dd/mm/yyyy) and value.
- 2. If you have missing data, use -99 in the place where you have missing data.
- (SWATplus Toolbox User Manual by C.J.Chawanda, 2021)

Model Efficiency

| Parameters | Equations |
|--|---|
| Coefficient of Determination (R ²) | $R^{2} = \frac{\sum_{i=1}^{n} (Y_{obs} - \overline{Y}_{obs})(Y_{sim} - \overline{Y}_{sim})}{\sqrt{\sum_{i=1}^{n} (Y_{obs} - \overline{Y}_{obs})^{2}} \sqrt{\sum_{i=1}^{n} (Y_{sim} - \overline{Y}_{sim})^{2}}}$ |
| Nash-Sutcliffe Efficiency (NSE) | $NSE = 1 - \left[\frac{\sum_{i=1}^{n} (Y_{obs} - Y_{sim})^{2}}{\sum_{i=1}^{n} (Y_{obs} - \overline{Y}_{obs})^{2}}\right]$ |
| Percent BIAS (PBIAS) | $PBIAS = \left[\frac{\sum_{i=1}^{n} (Y_i^{obs} - Y_i^{sim}) X 100}{\sum_{i=1}^{n} (Y_i^{obs})}\right]$ |
| Root Mean Square Error- observation Standard deviation Ratio (RSR) | $RSR = \frac{\sqrt{\sum_{i=1}^{n} (Y_i^{obs} - Y_i^{sim})^2}}{\sqrt{\sum_{i=1}^{n} (Y_i^{obs} - Y_i^{mean})^2}}$ |



Model Efficiency

| Performance Rating | R ² * | NSE* | RSR** | PBIAS** |
|-----------------------|--|----------------------|---|--------------------------------------|
| Unsatisfactory | $R^2 \le 0.6$ | $NSE \le 0.5$ | RSR > 0.7 | $PBIAS \ge \pm 25$ |
| Satisfactory | $0.6 < R^2 \le 0.75$ | $0.5 < NSE \le 0.70$ | 0.6 < RSR ≤ 0.7 | $\pm 15 \leq PBIAS < \pm 25$ |
| Good | $\begin{array}{rrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrr$ | 0.70 < NSE ≤ 0.80 | 0.5 < RSR ≤ 0.6 | $\pm 10 \leq PBIAS$ $\leq \pm 15$ |
| Very Good | $R^2 > 0.85$ | NSE > 0.80 | $\begin{array}{l} 0.50 \geq \mathrm{RSR} \\ \geq 0 \end{array}$ | PBIAS <±10 |

Source: *Moriasi et al. (2015) **Ang and Oeurng (2018); Ayele et al. (2017)



Comparison of 2015 and 2020 Land Cover Area (hectares)

| Classificatio n | Land Cover | 2015 Area (Ha) | 2020 Area (Ha) | Difference in Area | Percent Increase/(De |
|--------------------|------------|-------------------|-------------------|-----------------------|-------------------------|
| | | | | | crease) |
| Annual Crop | AGRL | 6490.72 | 6920.21 | 429.49 | 6.62% |
| Brush/Shrub | RNGB | 24824.01 | 23513.31 | -1310.7 | (5.28%) |
| S | | | | | |
| Built-up | URMD | 672.97 | 1450.69 | 777.72 | 116% |
| Closed | FRST | 16743.97 | 21953.61 | 5209.64 | 31.12% |
| Forest | | | | | |
| Inland | WATR | 1597.42 | 1163.85 | -433.57 | (27.14%) |
| Water/Fishpo | | | | | |
| nd | | | | | |
| Grassland | RNGE | 9504.79 | 6924.88 | -2579.91 | (27.12) |
| Mangrove | WETF | 4.90 | 3.22 | -1.68 | (34.29) |
| Forest | | | | | |
| Open Forest | FRSD | 22063.99 | 18443.70 | -3620.29 | (16.41%) |
| Open/Barren | BARR | 1314.46 | 1509.02 | 194.56 | 14.80% |
| Perennial | AGRR | 4660.73 | 6019.18 | 1358.45 | 29.15% |
| Crop | | | | | |

- Annual crop increases by 429.49 hectares.
- Perennial crop (AGRR)
 steadily increased by
 1358.45.
- Open forest continues to lower by 3620.29 hectares.

Comparison of 2010 and 2020 Land Cover Area (hectares)

| Classification | Land Cover | 2010 Area (Ha) | 2020 Area (Ha) | Difference in Area | Percent Increase /(Decrease) |
|------------------------------|------------|-------------------|-------------------|-----------------------|------------------------------------|
| Annual Crop | AGRL | 4560.54 | 6920.21 | 2359.67 | 51.74% |
| Brush/Shrubs | RNGB | 14744.59 | 23513.31 | 8768.72 | 59.47% |
| Built-up | URMD | 447.17 | 1450.69 | 1003.52 | 224% |
| Closed Forest | FRST | 20114.97 | 21953.61 | 1838.64 | 9.14% |
| Inland Water/Fishpon d | WATR | 681.25 | 1163.85 | 482.6 | 70.84% |
| Grassland | RNGE | 1917.76 | 6924.88 | 5007.12 | 261% |
| Mangrove Forest | WETF | | 3.22 | 3.22 | |
| Open Forest | FRSD | 45042.99 | 18443.70 | -26599.29 | (59.05%) |
| Open/Barren | BARR | 601.10 | 1509.02 | 907.92 | 151% |
| Perennial Crop | AGRR | 245.89 | 6019.18 | 5773.29 | 2347% |

- Annual crops (AGRL) increased from 4,560.54 hectares in 2010 to 6,920.71 hectares in 2020.
- Perennial crops (AGRR) experienced a remarkable surge, increasing from 245.89 hectares in 2010 to 6,019.18 hectares by 2020.
- On the other hand, this growth came at the expense of natural ecosystems, most notably open forest areas, which declined sharply from 45,042.99 hectares in 2010 to 18,443.70 hectares in 2020.



| Scenario No. | Description |
|--------------|--|
| 0 | Baseline |
| 1 | Reduction of 16.41% Open Forest to |
| | Agricultural Crop (AGRL) |
| 2 | Reduction of 16.41% Open Forest to Perennial Crop (AGRR) |
| 3 | Reduction of 59.05% Open Forest to Agricultural Crop (AGRL) |
| 4 | Reduction of 59.05% Open Forest to Perennial Crop (AGRR) |

- Scenario 0 represents the baseline condition, serving as a reference with no changes or interventions, and provides insights into the status of the watershed under current land use patterns.
- Scenarios 1 and 2 involves the reduction of open forest by 16.4% while scenarios 3 and 4 increases the reduction by 59.05%.
- These percentages are the actual reduction of open forest in a span of 5 years and 10 years, respectively.

Agriculture Performance Statistics for the year 2022

Source: Department of Agriculture-Western Visayas

| Commodity | Growth Rate | Yield (MT/hectare) |
|-----------------|-------------|--------------------|
| Irrigated Palay | 7.13% | 4.06 |

| Commodity | Growth Rate | Area (hectare) |
|-----------|-------------|----------------|
| Abaca | 1.76% | 415,727 |
| Eggplant | 13.21% | 4,099 |
| Cassava | 15.71% | 63,521 |

In terms of producing high-value crops, such as abaca, eggplant and cassava, as well as irrigated palay, the Province of Aklan leads the region, according to regional reports from the Department of Agriculture-Western Visayas.



| Scenario No. | BMP | Description |
|--------------|---|--|
| 0 | - | |
| 1 | Conservative Tillage of Cassava Production | Minimal disturbance and better residue cover, soil is less prone to compaction and improve root penetration. |
| 2 | Mulch Tillage of Eggplant Production | Mulch tillage leaves crop residues on the surface, reducing evaporation and helping maintain consistent soil moisture |
| 3 | Grass Waterways (Medium) Manning's Coefficient=0.03 | Moderate grass waterways to slow runoff and capture sediments |
| 4 | Grass Waterways (High) Manning's Coefficient=0.05 | Denser grass waterways for greater erosion control |

- BMP 1, which involves conservative tillage for cassava production with minimal disturbance and improved residue cover, results in a soil that is less prone to compaction and enhances root penetration.
- BMP 2, mulch tillage of eggplant production, leaves crop residues on the surface, reducing evaporation and helping maintain consistent soil moisture.
- BMP 3 utilizes moderate grass waterways to slow runoff and capture sediments, while BMP 4 employs denser grass waterways for enhanced erosion control.



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Watershed Delineation

- Watershed delineation depends on DEM within the SWAT.
- ➢ Total Area: 87,877.98 ha
- ➢ Largest Area: 9,684.36 ha
- Smallest Area: 256.50 ha
- As a result, 31 subbasins were created in the Aklan River Watershed.





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HRU Definition

- ➢ Number of Channels: 240
- ▶ Number of LSUs: 240
- ▶ Number of HRUs: 4343

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Observed Streamflow of Aklan River Watershed



- Most of the increase in streamflow was from the month of June to August where rainy seasons occur in the Philippines (DOST-PAGASA).
- Low streamflow was from the month of March to May where hot dry seasons occur (DOST-PAGASA)
- There were no observations from November 2010 to April 2012, as well as November 2018 to December 2018.
- Based on historical data, there was a typhoon that hit Panay island in June 2008, and the rainfall exceeds 300mm (dark area)
- More rain in 2012-2013 (Prado, 2015), and normal rainfall condition on the year 2014







Performance measures using SWAT+ toolbox for the year 2020

| Performance | Calibration | | Validation | |
|----------------|-------------|--------------|------------|--------------|
| Measures | Value | Remarks | Value | Remarks |
| R ² | 0.75 | Satisfactory | 0.83 | Good |
| NSE | 0.76 | Good | 0.78 | Good |
| PBIAS | 24.63 | Satisfactory | 18.89 | Satisfactory |
| RSR | 0.64 | Satisfactory | 0.51 | Good |

During calibration, the R² value was 0.75, and during validation, it increased to 0.83, indicating a strong positive correlation with the observations.

- The Nash-Sutcliffe Efficiency (NSE) recorded 0.76 during the calibration and 0.78 during the validation, thus supporting credibility with absolute accuracy, as a value higher than 0.70 is considered indicative of good model performance.
- The Percent Bias (PBIAS) remained well within acceptable limits, suggesting that, in general, the model was not significantly overestimating or underestimating streamflow results.
- The Root Mean Square Error Standard Deviation Ratio (RSR) across the essentially altered conditions of 2020 remained very low, indicating that the overall effect of prediction error was indeed less compared to an equal reduction in variability across the observed data at hand.



Sensitivity Analysis



Sobol's method of Global Sensitivity Analysis is a variance base methods of sensitivity analysis method which is capable in computing "first order indices or first order effects' and the 'Total Sensitivity Indices (TSI) or Total Effects' (Bilal, 2014).

The SCS runoff number for moisture condition II (CN2) was identified to be the most sensitive parameters for estimating the surface runoff, consistent with the findings of Puno et al. (2019) and Briones et al. (2016).



Sediment Yield of Aklan River Watershed



Sediment yield consistently increased from 20.546 t/ha/yr in 2010, 24.901 t/ha/yr in 2015 to 33.524 t/ha/yr in 2020.

This ten-year increase highlights a notable escalation of erosion in the watershed.





Spatial Distribution of Sediment Yield for the year 2010, 2015, and 2020





| Landscape | Sediment Yield (t/ha/yr) | |
|------------|--------------------------|------|
| Unit (LSU) | | |
| No. | 2015 | 2020 |
| | | |
| 1170 | 14 | 14.2 |
| | | |
| 2040 | 7.91 | 8.31 |
| | | |
| 1990 | 15.2 | 15.7 |
| | | |



| Landscape Unit (LSU) | Sediment Yield (t/ha/yr) | |
|-------------------------|--------------------------|------|
| No. | 2010 | 2020 |
| 820 | 4.33 | 6.49 |
| 2160 | 5.28 | 8.96 |
| 2210 | 12.2 | 17.7 |



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Sediment Yield of Aklan River Watershed



- Scenario 4, which entails a 59.05% reduction of open forest to perennial crops (AGRR), yields more sediment than Scenario 3, which represents the exact extent of forest conversion to annual crops (AGRL).
- In Scenario 4, a large number of perennial crop conversions took place in LSUs with steep slopes and highly erodible soils.
- This highlights that even land-use transitions thought to be sustainable may worsen erosion when implemented on sensitive terrain unless they are accompanied by technical assistance and spatial guidance.



Spatial Distribution of Annual Average Sediment Yield from the Scenarios representing SWAT+ LSU



- The findings demonstrate that BMPs such as grass waterways, mulch tillage, and conservative tillage significantly lower sediment yield.
- Grass waterways offered the best erosion control among these, with dense vegetation that greatly trapped silt and slowed runoff.
- By preserving surface residue and improving infiltration, both conservative tillage and mulch tillage demonstrated excellent performance.





Spatial Distribution of Annual Average Sediment Yield from the BMPs representing SWAT+ LSU



Summary and Conclusion

Objective 1

To utilize, adapt, and calibrate the Soil and Water Assessment Tool+ (SWAT+) model to assess the streamflow of the Aklan River Watershed

Summary and Conclusion

- The results showed satisfactory to good performance statistics (R² ranging from 0.75 to 0.83; NSE from 0.76 to 0.78; PBIAS from 24.63 to 18.89; RSR from 0.64 to 0.51), indicating that the SWAT+ model can accurately describe the hydrologic processes in the Aklan River Watershed.
- Sensitivity analysis further demonstrated the importance of parameters such as CN2 (Curve Number), ESCO, and FLO_MIN in influencing model output, specifically surface runoff and streamflow.



Summary and Conclusion

Summary and Conclusion

- The average sediment yield increased from 20.564 tons per hectare per year in 2010, 24.901 tons per hectare per year in 2015, to 33.524 tons per hectare per year in 2020.
- Even over a 5-year period, the gains show a steady upward trend in erosion, although they seem modest, particularly in LSUs situated on sloping terrain where forest loss has occurred.
- Continuous forest-to-crop conversion occurred in these land-use systems (LSUs), resulting in increased soil exposure and subsequent erosion over time.

Objective 2

To assess the effects of different agricultural land cover scenarios on sediment yield in the Aklan River watershed using the SWAT+ model; and



Summary and Conclusion

Summary and Conclusion

- The study presented and modeled the effects of three Best Management Practices (BMPs): grass waterways both medium and high, mulch tillage, and conservative tillage.
- The BMPs was strategically in line with regional farming practices based on the agriculture statistical performance of the Department of Agriculture-Western Visayas.
- Since grass waterways stabilize flow channels, reduce runoff, and filter particles before they enter streams, they are very efficient at lowering silt in important erosion hotspots.
- Conservative and mulch tillage methods were effective in minimizing soil disturbance, retaining surface leftovers, and reducing erosion.



Identify potential management options based on SWAT+ simulation results.



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