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## Research Article

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# Spatiotemporal Modeling of Nutrient Retention in a Tropical Semi-Arid Basin

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## ABSTRACT

*The Sokoto-Rima basin defines the natural and socioeconomic lifeblood of northwestern Nigeria. Its agrarian nature is an indication of significant dependence on the supply of ecosystem services from its various rivers, streams, and wetlands. However, nitrogen (N) and phosphorus (P) constitute a great portion of chemical fertilizers used to enhance crop yields and poor management of these portend great threats for water quality. The overarching objective of this study was to examine the extent of spatial variation of nutrient dynamics in the Sokoto-Rima basin between 1992 and 2015 using the nutrient delivery ratio (NDR) model of InVEST (Integrated Valuation of Ecosystem Service and Tradeoffs) software. Landcover, precipitation, digital elevation, and biophysical variables were the principal datasets employed as software input. The result of the study showed that the surficial N load is almost 15-fold of P in the Sokoto-Rima basin. Over the period of study, cultivated areas and rivers were spatially detected as nutrient sources and sinks respectively. The subsurface nutrient load is dominated by P while the amount of N load is insignificant. The trend of nutrient export is linearly defined: with 0.87% and 1.7% increase in N and P export respectively during 1992-2015. N and P exports vary spatially with a north-south increase-decrease index. Critical length and threshold are highly sensitive to changes in the parameterization of the NDR model. Thus, synergistic cultivation practices such as agroforestry should be extended to existing crop cultivation complexes to curtail nutrient enrichment in the Sokoto-Rima basin and ensure environmental sustainability.*

**Keywords:** Ecosystem services, InVEST, Nutrient modeling, Semi-arid, Sokoto-Rima basin, Spatial variation.

## INTRODUCTION

One of the numerous ways in which anthropogenic activities alters the natural nutrient cycling of any ecosystem is through land use changes particularly agricultural expansion [1-6]. Given that nutrient flow is a vital ecosystem service that regulates ecosystem integrity, changing pattern of land use and landcover can alter this natural pathway leading to distortions in ecosystem functioning and by extension ecosystem intactness. Point sources of nutrient discharges particularly industrial effluent and non-point sources from domestic and agricultural activities constitute a high proportion of human-induced distortions to the natural nutrient flow in any ecosystem [1, 7]. Within tropical systems particularly in semi-arid areas of the world where agriculture determines the lifeblood of the local economy, this scenario persists such that

38 rainwater flows over the cultivated landscape washing away animal manure, chemical  
39 fertilizers and wastes from domestic sources into abutting streams and rivers [8]. This causes a  
40 great threat to both human health and welfare [9] and the associated aquatic life in the water  
41 bodies with restricted capacity to adapt to accumulative eutrophication and possible pollution  
42 [10, 11].

43 In controlling non-point source nutrient discharges particularly in areas of intense application  
44 of chemical fertilizers to enhance maximum outputs, ecosystems provide natural measures for  
45 amelioration such that vegetation can remove pollutants via tissue storage or aiding natural  
46 cycling in another form [12, 13]. In addition, non-polluted soil as well as wetlands provide  
47 suitable pollution-mitigation by providing nutrient storage prior to in-washing into hydrological  
48 systems [13-15]. In the engagement of pollution control measures particularly within agrarian  
49 circles, nutrient loads are often assessed by estimating the proportion of specific nutrients that  
50 are present within identifiable non-point sources across the landscape. Two of the most common  
51 pollutants in virtually any landscape is nitrogen (N) and phosphorus (P) from different  
52 environmental sources [12-14]. Studies across the semi-arid hydrologic basins suggests that N  
53 and P driven nutrient load exists in higher proportion within crop cultivation dominated areas  
54 than any other discernible landcover class. For instance, [12] specified that 68% of the  
55 pollutants within the agricultural region of Fenhe River are N compounds. [16] conducted a  
56 study across the expanded urban terrestrial ecosystem across the agrarian area of the Mississippi  
57 River in the Capitol Region Watershed (CRW) of the United States and results showed that  
58 22% and 80% of net P and N inputs from cultivated regions were retained in the basin while  
59 the difference were washed downstream. With respect to semi-arid areas, [15] asserted that such  
60 areas with less dense vegetation tend to erode nutrients more than forested regions,  
61 consequently emphasizing the high propensity to stimulate eutrophication and nutrient-filled  
62 stream flow rivers.

63 Geochemical characterisation of semi-arid water bodies such as lakes, streams and rivers have  
64 been studied showing heavy nutrient loads with little or no focus on retention capacities making  
65 it difficult to analyse the impact of such on river hydrology [3, 5, 6, 8, 10]. [10] stressed that  
66 semi-arid soils of the Basara region of India has been polluted by nitrates and phosphates  
67 affecting the ability of water users' reliance on it for domestic and agricultural purposes. [12]  
68 underscored that sediment characterisation of agrarian landscapes of the Shanxi Province of  
69 China had altered some features of the local hydrology. Within the context of Nigeria, studies

70 such as [14, 17-20] suggest that the country is not invulnerable to the realities of this problem  
71 particularly to water quality and river eutrophication.

72 Studies have also shown that the water quality of the surface water and groundwater ecosystem  
73 of the Sokoto-Rima basin of north-western Nigeria has been altered by series of anthropogenic  
74 activities ranging from local industrial effluent discharge into streams [18, 19] as well as  
75 manure and fertilizer in-washing into water bodies [14, 18, 20, 21]. Specifically, [14] used the  
76 point-based sample collection method to analyse to affirm the temporal variations of N and P  
77 derivatives of the Kware Lake in within the Sokoto-Rima which is traceable to human-induced  
78 sedimentation of the freshwater ecosystem. Similarly, [18] analysed physicochemical  
79 parameters of water samples collected along defined points along the Sokoto River to determine  
80 seasonal variations of its water quality. [20] examined surface water and groundwater  
81 characterisation of the Sokoto-Rima basin focusing on isotopic and geochemical  
82 characterisation determining only the nutrient loads of the identified groups. [21] investigated  
83 the level of certain anions of the Argungu River using in situ sample collection and direct  
84 analysis methods while the results showed that the river low pollution status of the nutrient  
85 loads.

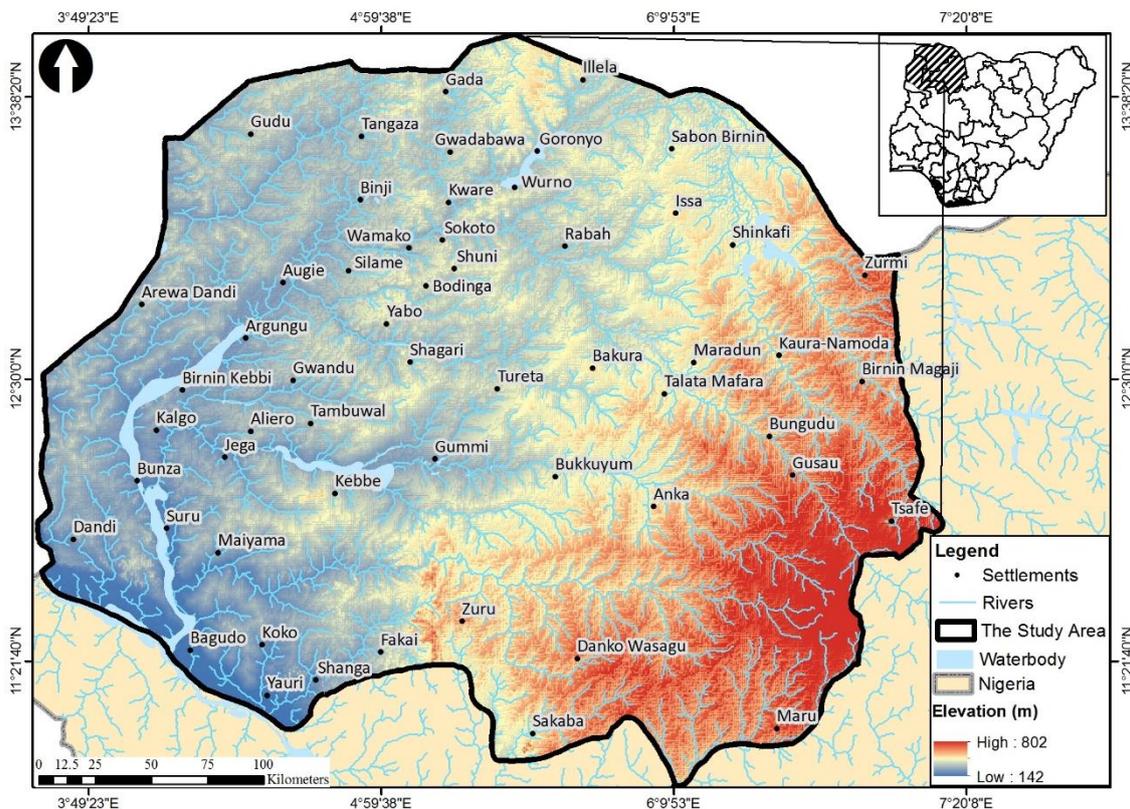
86 The underlying assumption employed in these previous studies within the Sokoto-Rima basin  
87 refused to consider the complete phase of nutrient flow which consists of nutrient import source,  
88 uptake by plants and animals, export and other dispersal modes which are vital ecosystem  
89 services [5, 6, 11]. In addition, spatial distribution of these characteristics and variation  
90 overtime remains critical so as to identify location of these dispersion and utility pathways  
91 across the semi-arid landscape [7-8]. In this study, an attempt is made to spatially characterise  
92 the nutrient delivery conduit of the Sokoto-Rima basin focussing on the surface, and subsurface  
93 layers as well as to examine the variations in export mechanisms of N and P using a geographic  
94 information system (GIS) oriented model. This approach thus provides a cost-effective fashion  
95 and synoptic visualization of the nutrient flow and its variation across the landscape of the  
96 Sokoto-Rima basin while guaranteeing sustainable environmental assessment.

## 97 **2. MATERIALS AND METHODS**

### 98 **2.1 The study area**

99 The study was conducted in the Nigerian section of the transnational hydrological basin referred  
100 to as Sokoto-Rima basin. It is bounded in the north by Niger Republic, and in the west by Benin

101 Republic while in the east and south by Katsina and Niger States of Nigeria. Its geographical  
 102 location is defined by Latitudes 10°32'35" N to 13°32'55" N and Longitudes 3°30'30" E to  
 103 8°1'15" E and the total land area is 94,026.5 km<sup>2</sup> (Fig 1). The semi-arid climate of tropical  
 104 savanna of West Africa dictates the environmental condition of the study area. Precipitation  
 105 (mostly rainfall) is typically seasonal, quasi-monsoonal in nature; confined to the wet season.  
 106 Annual rainfall ranges between 350 mm to 895 mm in the northern and southern ends typifying  
 107 a north-south rainfall increase index. Through the year, diurnal temperature averages 30<sup>0</sup> C with  
 108 significant seasonal variability. Vital to nutrient flow is the hydrological network which flows  
 109 westwards from the eastern highlands and ends southwards into the River Niger. The rock  
 110 typology is dominated by the basement complex that is spatially restricted to the east. The  
 111 sedimentary basin of the central and southern axis activated by the hydrologic and hydraulic  
 112 activities of the Sokoto and Rima Rivers with several spots of rolling hills (Fig 1). Small-scale  
 113 and climate-dependent agriculture is the mainstay of the Sokoto-Rima basin. Rice, tomatoes,  
 114 beans, sorghum, maize, groundnut and millet are the key crops cultivated. Settlement pattern is  
 115 mainly rural typified by crop production and rearing of cattle, ram, goats and sheep.



116  
 117 *Fig 1. Geographical location of the Sokoto-Rima basin in context of northwestern part of*  
 118 *Nigeria with the hydrological network and relief*

## 119 **2.2 Data sources**

120 The landcover data from the Climate Change Initiative (CCI) of the European Space Agency  
121 (ESA) was used as data spine for landcover characterization of the study. The pre-classified  
122 data has 300 meters spatial resolution with auto-rectified benefits nullifying further image  
123 registration and rectification tasks. It has a dynamic range of 32-bit which is wide enough for  
124 detection of homogenous landcover classes. It also has regional coverage thus preventing edge-  
125 matching errors and continuous phenomenal assessment; an advantage it possesses over  
126 existing remotely sensed data sources such as Landsat and Sentinel. Data for the years 1992,  
127 2002, 2015, and 2015 were sourced based on availability at  
128 <http://maps.elie.ucl.ac.be/CCI/viewer/profiles.php>.

129 Nutrient runoff proxy data was based on mean annual rainfall which acquired from climate  
130 synoptic stations within and outside the basin to permit proximate geographic coverage. The  
131 data were acquired from Sokoto, Yelwa, Birnin Kebbi, Argungu, Gusau, Goronyo, Wurno,  
132 Kano, and Kaduna in Nigeria and Malanville in Benin Republic and Niger Dabnou in Niger.  
133 Data for the years 1992, 2002, 2012 and 2015 were to match the previously explained landcover  
134 datasets extracted for the study. The data was acquired from the Nigerian Meteorological  
135 Agency (NIMET).

136 Digital Elevation Model (DEM) data was extracted from the West African grid of the ALOS  
137 World 3D Digital Surface Model (DSM) version 2.2 data obtained from the digital libraries of  
138 Japan Aerospace Exploration Agency (JAXA) through <https://www.eorc.jaxa.jp/>. The data has  
139 a 32-meters spatial resolution resampled to 300 meters resolution for data consistency with the  
140 landcover data. Its respective radiometric resolution of 32 bit also ensure fitness for feature  
141 detection consistency.

## 142 **2.3 Quantifying nutrient retention**

143 In this study, the Nutrient Delivery Ratio (NDR) model an integrated module in the InVEST  
144 (Integrated Valuation of Ecosystem Services and Tradeoffs) software package was employed  
145 to spatiotemporally quantify nutrient retention. InVEST is a free and open-source software  
146 package with extensive utility for modeling and assessing diverse ecosystem services  
147 principally based on landcover dynamics in conjunction with other environmental variables [1,  
148 11]. The NDR model employs a mass-balance approach to spatially simulate the flow of  
149 nutrients as influenced by the inherent natural vegetation and other nutrient constraining and  
150 stimulating factors. The outcome of the model generates raster datasets that provides spatial

151 information about nutrient loads (nutrient sources), exports, and the actual NDR for each of N  
 152 and P. Data inputs into the NDR model include the prior described data on DEM, landcover,  
 153 and nutrient runoff. The associated biophysical parameters are classified into tabulated data  
 154 which include nutrient loads, retention efficiency, and subsurface proportion for N and P  
 155 respectively (see Table 1). The software default value of 2.4 for Borselli  $K$  parameter  
 156 (calibration function between hydrologic and sediment flow) was retained while threshold flow  
 157 accumulation value was set at 10,000 which corresponds to 300 m data resolution. Three  
 158 outputs were thus modeled from the NDR simulation.

159 *Table 1. Landcover based biophysical variables used for nutrient modeling*

Landcover description	Load (N)	Efficiency (N)	Critical length (N)	Proportion subsurface (N)	Load (P)	Efficiency (P)	Critical length (P)	Proportion subsurface (P)
Cropland	89	0.5	25	0.3	3.57	0.48	15	0.01
Agroforestry	89	0.6	50	0.25	2.48	0.54	15	0
Shrubland	8	0.75	150	0.47	0.93	0.6	25	0
Grassland	8	0.75	150	0.47	0.93	0.6	30	0
Waterbody	2	0.05	10	0.66	0	0.4	15	0
Settlements	10	0.1	10	0.2	2.1	0.26	15	0
Bare surface	5	0.01	10	0.47	0.79	0.26	15	0
Woodland	2.8	0.8	300	0.47	1.4	0.67	20	0

160 Adapted from [1, 11, 22]

161 **Surface NDR** focusses on the surficial traits of the basin defined by the multiplication delivery  
 162 factor (downstream nutrient transportation excluding retention) and topographic position of the  
 163 landscape. Mathematically, this is expressed as:

$$164 \quad NDR_I = NDR_{0,I} \left( 1 + \exp \left( \frac{IC_i - IC_0}{k} \right) \right)^{-1} \quad (1)$$

165 where:  $IC_0$  and  $k$  are calibration parameters,  $IC_i$  is topographic index computed from the DEM  
 166 data, and  $NDR_{0,I}$  is the ratio of retained nutrient by pixels downstream the lanscape.

167 **Subsurface NDR** which is the second output is based on geographic function of distance decay  
 168 or the first law of geography which states that closer events are spatial connected than distance  
 169 events. The subsurface NDR relates with distance to stream and the utmost subsurface nutrient  
 170 holding and it is defined in equation (2) as:

$$171 \quad NDR_{subs,1} = 1 - eff_{subs} \left( 1 - e^{\frac{-5.l}{l_{subs}}} \right) \quad (2)$$

172 where:  $eff_{subs}$  is the maximum retention efficiency traceable through the subsurface pathway  
173 in the multispectral space,  $l_{subs}$  is the subsurface flow retention length detected at soil  
174 maximum capacity,  $l_i$  is the distance from the pixel to the stream.

175 **Nutrient export** from a given multispectral location is a function of the nutrient load and the  
176 NDR, this is further explained in equation (3) as:

$$177 \quad x_{exp_i} = load_{surf,1} (NDR_{surf,i} + load_{subs,i}) NDR_{subs,i} \quad (3)$$

178 At the basin level, equation (3) aggregates all the pixels within the multispectral space to give:

$$179 \quad x_{exp_{tot}} = \sum_i x_{exp_i} \quad (4)$$

180 where:  $load_{surf,1}$  is the surface load at the first pixel, and  $NDR_{surf,i}$ ,  $load_{subs,i}$  and  
181  $NDR_{subs,i}$  is surface NDR, subsurface nutrient load and subsurface NDR loads respectively  
182 while  $x_{exp_i}$  is the specific nutrient export, aggregate of which generates the  $x_{exp_{tot}}$ .

## 183 **2.4 Sensitivity Analysis and Uncertainties of the Nutrient Export**

184 As a test of model performance, sensitivity analysis was conducted on the vital NDR model  
185 parameters particularly on critical length, threshold flow accumulation, Borselli  $k$  value, load  
186 and efficiency functions of each of the landcover classes. This was performed by increasing  
187 and decreasing parameter values by 50%, precisely: Borselli  $k$  parameter varied from the default  
188 of 2.4, to 1.2 and 4.8, the critical length was varied from the default value of 90 m to 45 m and  
189 180 m while the threshold flow accumulation was varied from 10,000 (default) to 5,000 and  
190 20,000. The load and efficiency values stated in Table 1 were adjusted  $\pm 50\%$  for each of the  
191 landcover values.

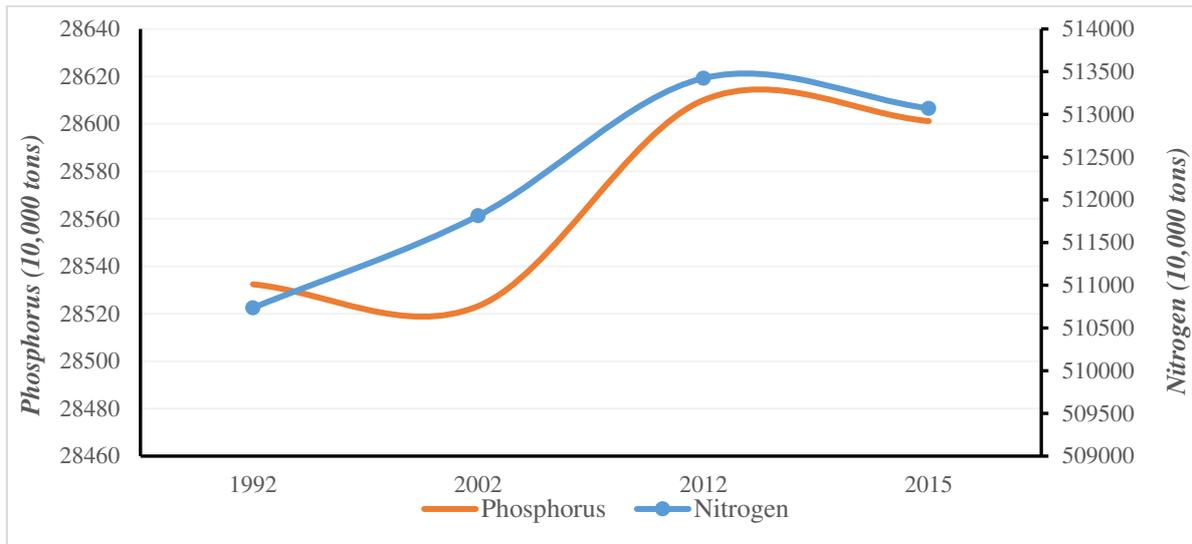
## 192 **3. RESULTS AND DISCUSSION**

### 193 **3.1 Nature and Dynamics of Surface Nutrient Load of the Sokoto-Rima Basin**

194 Surficial nutrient loads of the Sokoto-Rima basin as defined by the temporal distribution of N  
195 and P is displayed in Fig 2. During the period of study, N rises from 1992, peaks at 2012 and  
196 plunges slightly in 2015. This shows a linear relation with increasing mean annual load of 5,667  
197 tons increasing at 9.56 tons/year. Over the period of assessment, surficial N load increased from  
198 51,736 million tons to 513,070 million tons.

199 Spatially, Fig 3 shows that high N loads of roughly 8.22 kg per kilometer are directly connected  
200 to headwaters of the Sokoto-Rima basin throughout the years. The outline of Rivers Sokoto and

201 Rima shows that they water bodies contribute the least amount of surficial N loads. The baseline  
 202 year (1992) showed that tributaries of these main river networks in the eastern and northern  
 203 axis channels high N loads downstream. In addition, wetlands of the southern axis which are  
 204 mainly lowlands constitutes the highest N loads. By 2002, areas of high were observed in part  
 205 of central areas with roughly 50% increase in N load while most areas remain unchanged. This  
 206 observation changed slightly as notable spatial loads were detected around wetlands around the  
 207 major rivers as well as wetlands in the east. Slight changes were detected in 2015.



208  
 209 *Fig 2. Temporal trend of surface loads of nitrogen and phosphorus of the Sokoto-Rima basin*

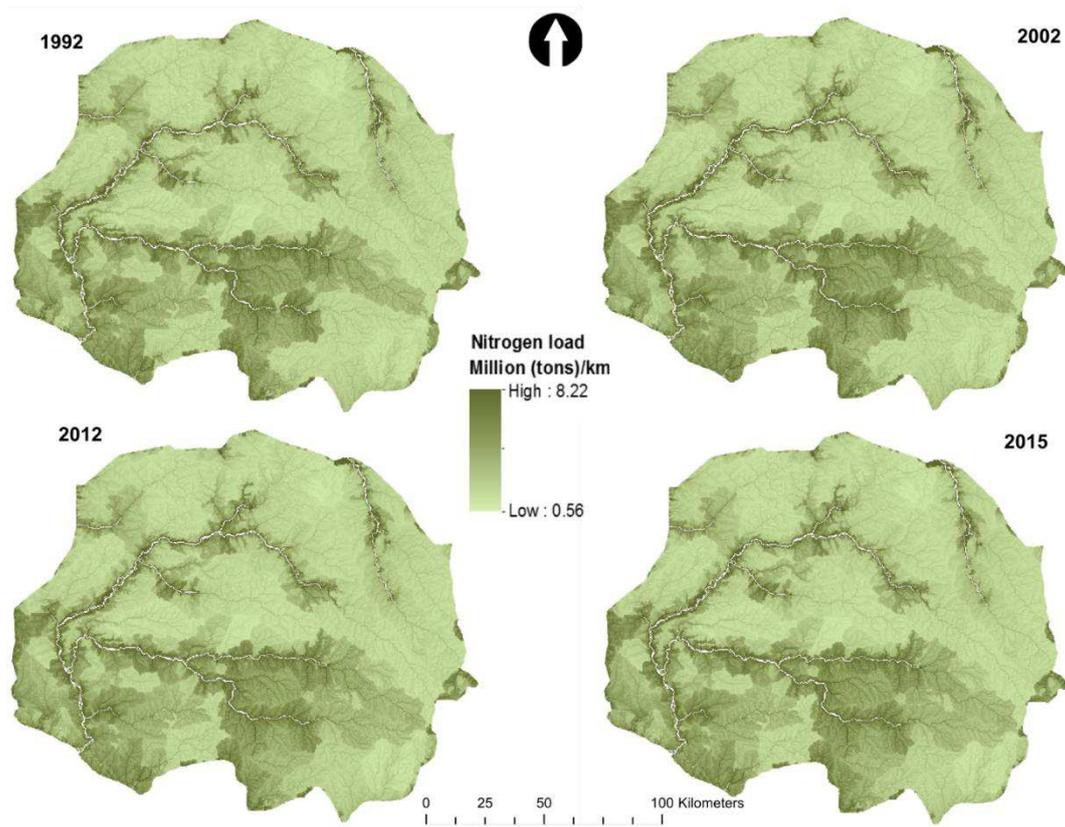
210 Surficial P load within the Sokoto-Rima basin increased annually with a mean annual load of  
 211 26,103 tons per unit area, increasing at a rate of 32 tons for every km (Fig 2). Precisely, the  
 212 baseline value of 28,532 million tons increased to 28,601 million tons. Its semi-sinusoidal curve  
 213 pattern showed the level of consumption and the extent of landcover of the Sokoto-Rima basin,  
 214 an area that is dominated by crop production.

215 Changes in spatial distribution of surficial P load showed pattern that is similar to that of N  
 216 where headwaters of the major streams that define the basin were detected as major sources  
 217 (Fig 4). On the eastern axis where most of the rivers takes their source accounts for over 70%  
 218 of the 5.86 million tons per km<sup>2</sup> of P. Areas at the lowest range of P with roughly 0.89 million  
 219 tons are directly proportion to areas of high intense crop production.

220 These results concurred with the findings of [14, 18 and 20]. Explicitly, [14] claimed that low  
 221 quantities of nitrate, nitrite, and ammonia (derivatives of N) and orthophosphates in Kware  
 222 Lake is an indication of fitness of the surface water for multipurpose uses especially during the  
 223 dry season. [18] stated that seasonal variation of N and P in surface water of the Sokoto River

224 lies between 1.77 mg/litre and 19.7 mg/litre which is suitable for crop cultivation but slightly  
225 above the required fitness for domestic consumption purposes. [20] indicated that the isotopic  
226 classification of the surface water classified that of Sokoto-Rima basin in Group IV and V with  
227 direct linkage to rainfall input and elevated values are directly connected to the presence of  
228 gypsum in some parts of the Sokoto-Rima basin.

229

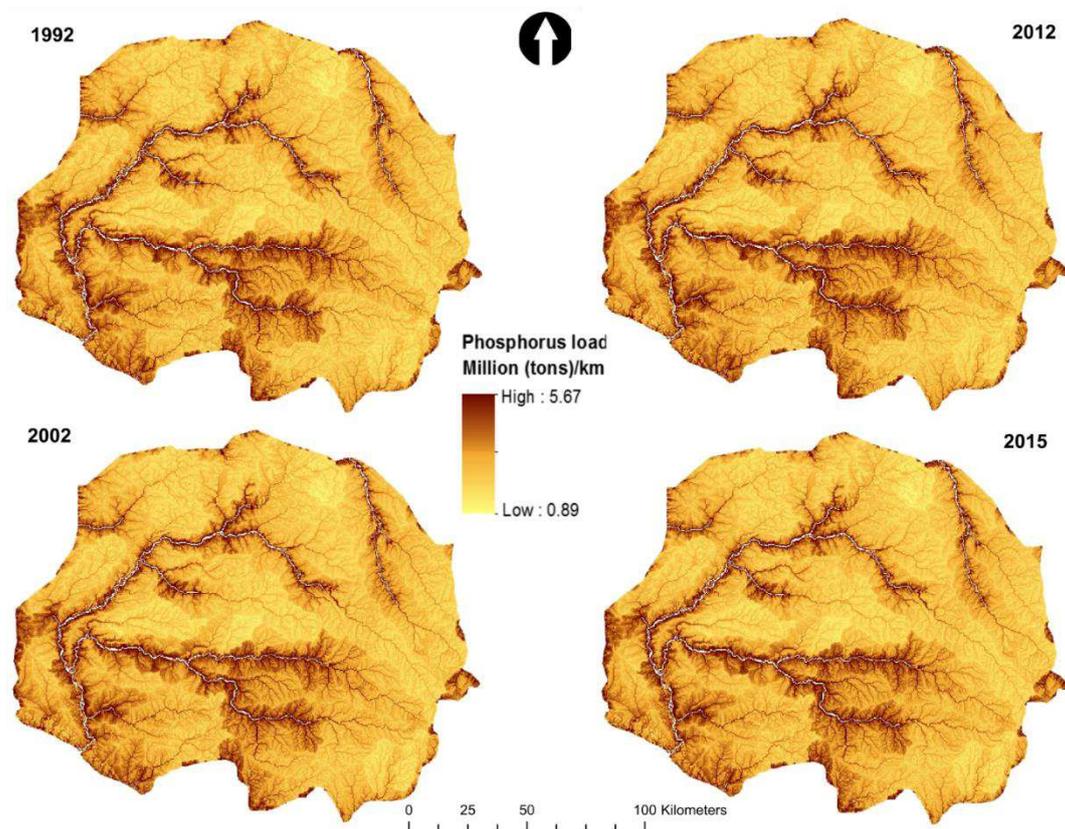


230

231 *Fig 3. Spatial distribution of surficial nitrogen load in the Sokoto-Rima basin for the years*

232

*1992, 2002, 2012 and 2015.*



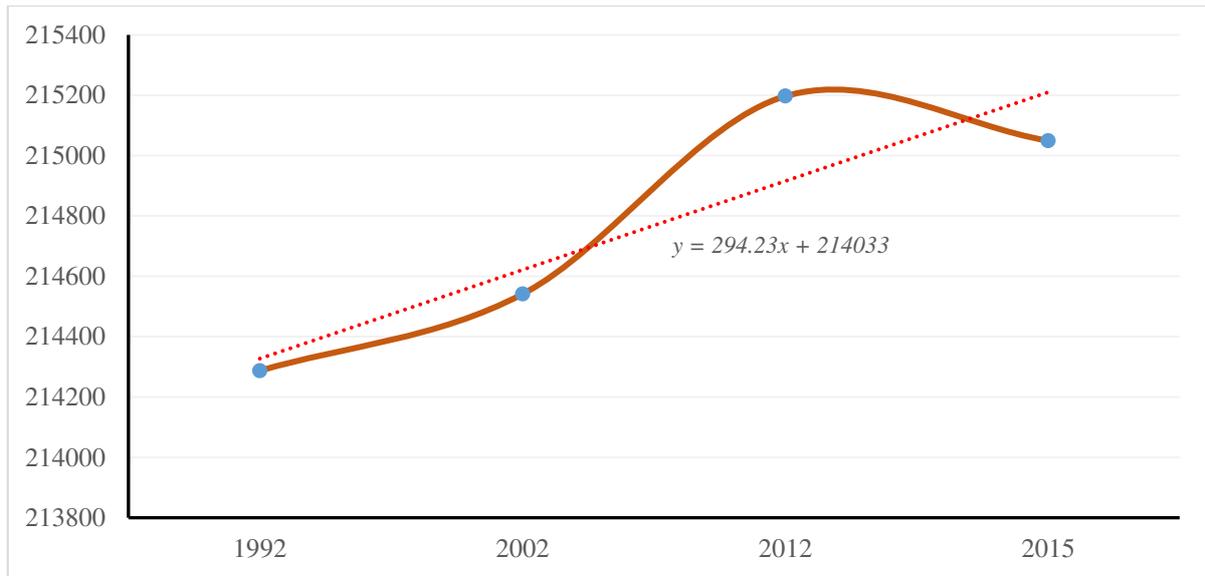
233

234 *Fig 4. Spatial distribution of surficial phosphorus load in the Sokoto-Rima basin for the years*  
 235 *1992, 2002, 2012 and 2015.*

### 236 **3.2 Nature and Dynamics of Subsurface Nutrient Load of the Sokoto-Rima Basin**

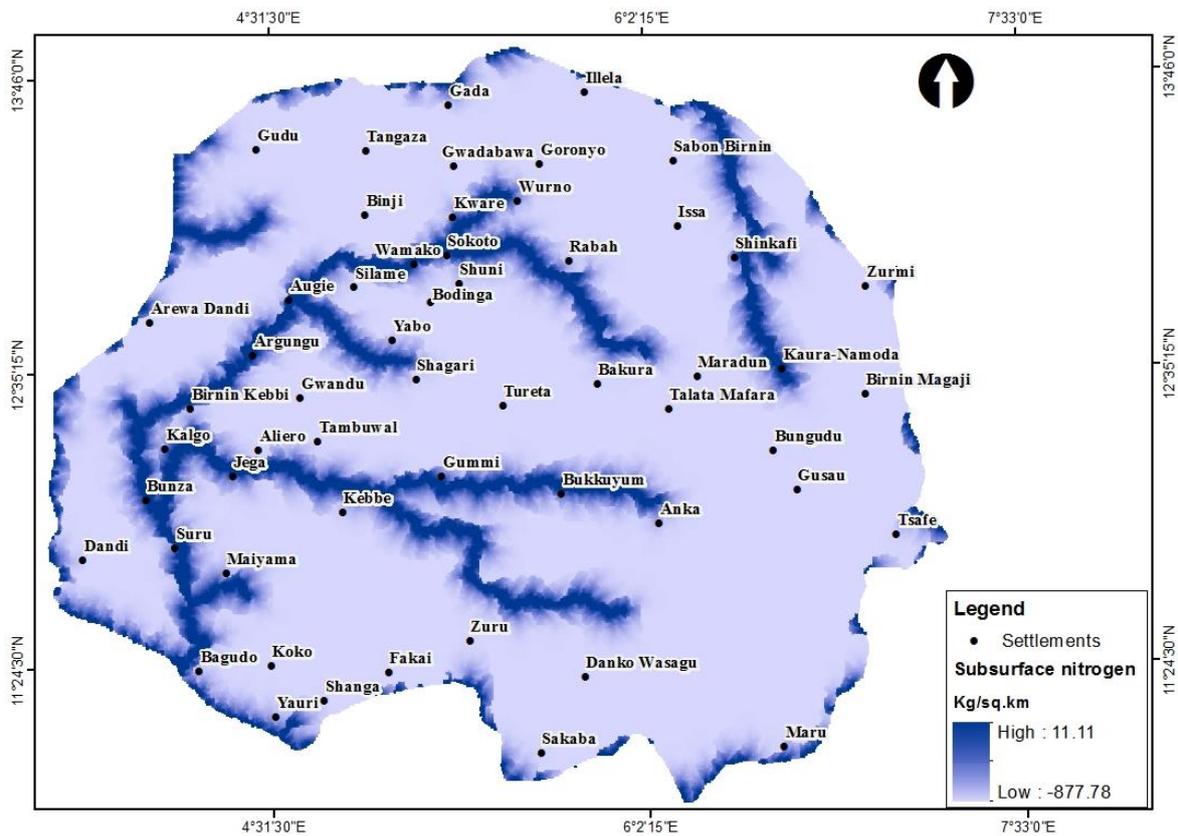
237 The outcome of subsurface nutrient load returned contrasting results as spatiotemporal  
 238 dynamics returned differing characterization for each of N and P. First, subsurface load of N in  
 239 the Sokoto-Rima basin returned no value. This is consistent with the deductions of [22 and 14]  
 240 who affirmed that N is a surficial nutrient element for driving crop productivity in the semi-arid  
 241 zone of northern Nigeria with low or no value at the subsurface level. These have been further  
 242 asserted by [8, 10] in China and India respectively where geochemical analysis of derivatives  
 243 of N yielded paltry outcomes.

244 According to [23] accumulated study of P over the centuries has showed a direct correlation  
 245 with human activities and its impacts on freshwater eutrophication in China. This shows that  
 246 there are latent chances of subsurface trend of P in an agrarian milieu such as the Sokoto-Rima  
 247 basin. Fig 5 showed that that P load increased from 2,128.7 million tons in 1992 to 2,150.5  
 248 million tons in 2015, 0.36% increase with a difference of 7.62 million tons. Despite this trend,  
 249 no spatial variation of subsurface P was detected an evidence of strong surface load forcing.



250

251 *Fig 5. Trend of subsurface phosphorus load of the Sokoto-Rima basin from 1992 to 2015*



252

253 *Fig 6. Spatial distribution of subsurface nitrogen loads of Sokoto-Rima basin (1992-2015)*

254 Within the time of this study, no specific spatial variation was detected in the amount of  
 255 subsurface N loads in the Sokoto-Rima basin, hence the extent of spatial distribution for the  
 256 year 1992 returned the same as 2015. However, Fig 6 showed that subsurface N loads were  
 257 spatially restricted to water bodies – rivers, streams and freshwater lakes, with highest values

258 11.11 kg/km<sup>2</sup>. This was followed by the adjoining wetlands with 1.09 kg/km<sup>2</sup>. Largely,  
 259 subsurface N loads are directly influenced by water-bearing landcover classes. This is because  
 260 N is a vital chemical component of aquatic ecosystems as it contributes extensively to the  
 261 growth and sustenance of aquatic organisms as part of their essential feedstock hence  
 262 performing a vital ecosystem service [6, 12]. The deficit range of loads observed in the other  
 263 areas can be attributable to high uptake of the nutrient as distinguished by crop consumption  
 264 rates [13, 16 22].

### 265 3.3 Trend of Nutrient Export in the Sokoto-Rima Basin

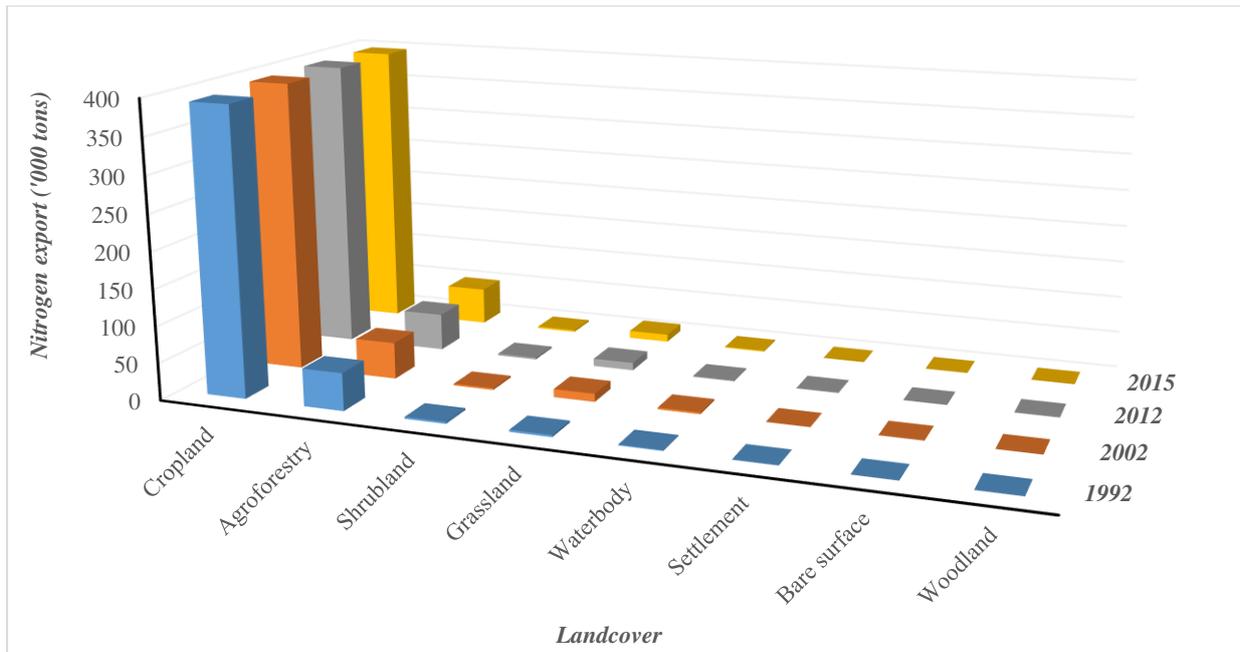
#### 266 3.3.1 Temporal dynamics of nutrient export

267 It has been established that nutrient export contributed to the increasing evidence of  
 268 eutrophication and sedimentation evaluated within freshwater bodies of the Sokoto-Rima basin  
 269 particularly Lake Kware [14]. It was noted that N exports accounted for over 65% of the nutrient  
 270 yields observed in the lake [14]. This could be directly associated with increasing intensity of  
 271 economic and social activities which has resulted in adjustments of the previous natural  
 272 conditions of the area. Cumulative cultivation of crops and animal domestication around the  
 273 wetlands and upland areas have led to introduction of nutrients such as herbicides, pesticides,  
 274 solid wastes from various domestic sources, sewage, chemical fertilizer runoff from cultivated  
 275 fields have been acknowledged in the Sokoto-Rima basin [19-21]. Over the course of this  
 276 current study, N export outweighs P as shown in Table 2 even though the proportionality of  
 277 increase overtime is low. The magnitude of change showed that from 1992 to 2015, N export  
 278 increase slightly by 0.87% with the greatest increase compared to baseline in 2012. Similar  
 279 pattern was detected for P with 1.7% increase. The trend is could be related to previously  
 280 acknowledged human activities.

281 *Table 2. Nitrogen and phosphorus export in 1992, 2002, 2012, and 2015.*

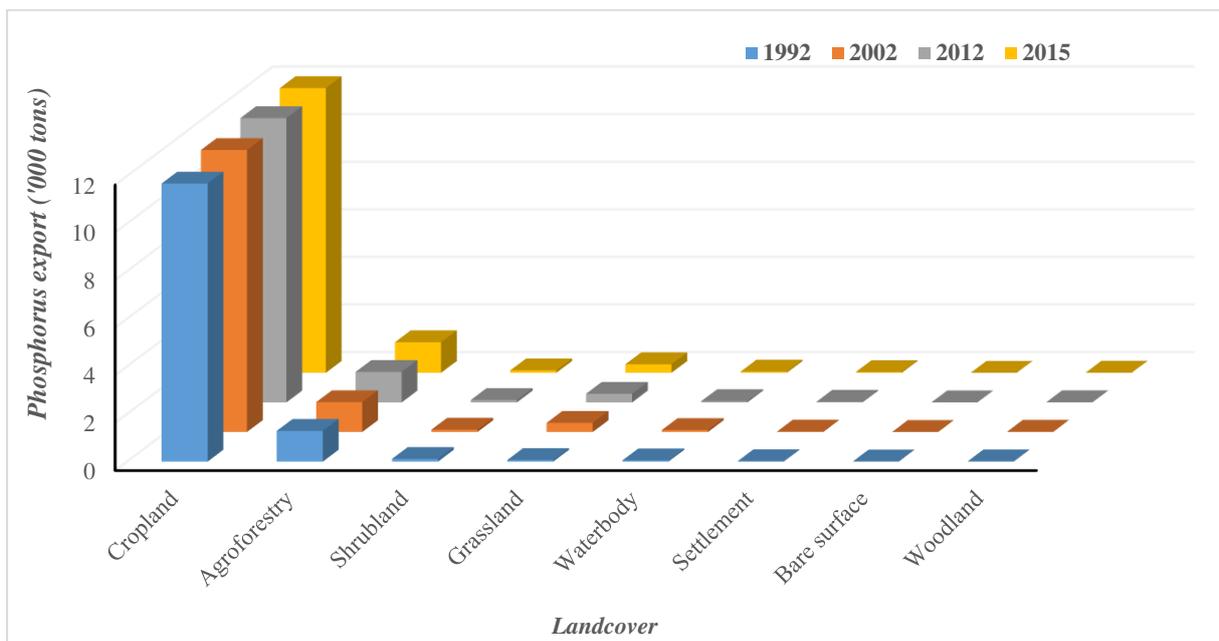
Year	Nutrient export (‘000 ton)		Percentage Change from baseline	
	Nitrogen	Phosphorus	Nitrogen export	Phosphorus export
1992	15,179.64	4.59	-	-
2002	15,278.19	4.62	0.65	0.74
2012	15,319.76	4.66	0.92	1.70
2015	15,311.09	4.66	0.87	1.70

282



283

284 *Fig 7. Nitrogen export of the Sokoto-Rima across the different landcover classes from 1992 to*  
 285 *2015*



286

287 *Fig 8. P export of the Sokoto-Rima across the different landcover classes from 1992 to 2015*

288 Fig. 7 and Fig 8 showed that cropland influenced nutrient export in the Sokoto-Rima basin with  
 289 almost 85% of the overall amount of nutrient exported. This is immediately followed by  
 290 agroforestry (which is mosaic of cropland and woodland) and grassland while bare surface  
 291 contributes the least nutrient export. Infinitesimal proportion of nutrients were also exported  
 292 from settlement. [26] had shown that Sokoto-Rima basin is cropland dominated and the trend  
 293 and proportionality is anticipated to persist in the future. This is expected to inhibit the

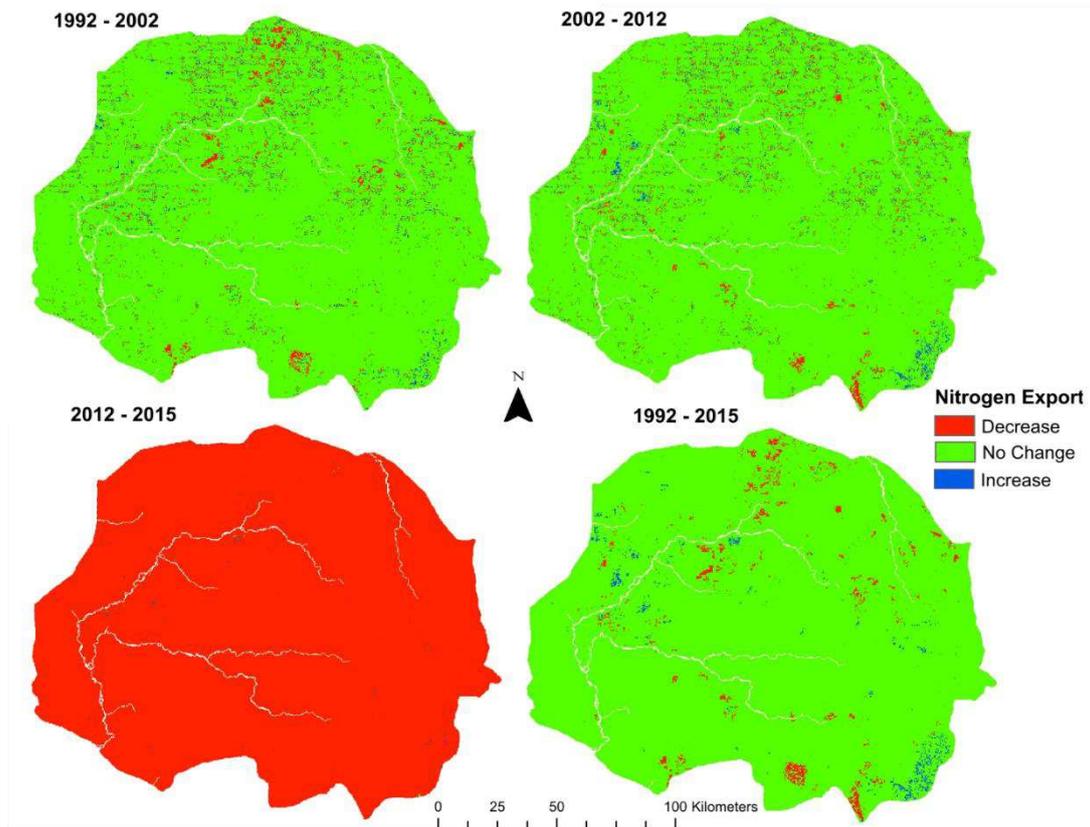
294 associated ecosystem services and possible nutrient export. Roughly 90% of N exported is from  
295 cropland while few amounts exported originated from grassland, shrubland, woodland, and  
296 waterbody. This describes the basin N cycle in which cultivated areas determines the nature  
297 and pattern of N with respect to low tree density forested areas.

298 Fig 8 specified that the proportion of P exported from the Sokoto-Rima basin is roughly 3-fold  
299 less than the magnitude of N. This is also directly related to the anthropogenic activities and  
300 limited P storage by the dominant landcover themes [23]. [25] argued that available N inputs  
301 in a given terrestrial ecosystem could trigger a coupled increase in other related nutrient  
302 elements thereby boosting nutrient cycling. However the scenario in a semi-arid environment  
303 such as the Sokoto-Rima basin where biomass response to increased N is very low, P export is  
304 high and co-related to anthropogenic forcing. This justification is proven by Fig 8 where natural  
305 landcover contributes the least to P export as the landscape is dominated actively by agrarian  
306 influences.

### 307 **3.3.2 Spatial variation of N and P export**

308 The spatial context of nutrient export of the Sokoto-Rima basin over the period of study showed  
309 dissimilar traits that explain the extent of place-based and location specific variations. In  
310 particular, spatial distribution and variation of N export as displayed in Fig. 9 showed that N  
311 export is generally unchanged within the period of study (1992-2015) typical justifying the  
312 temporal observations. Interval variation however depicts some explicitness. From 1992 to  
313 2002, spatial decreases in exported N were detected around wetlands and agroforestry of the  
314 north.

315 Spots of decreases were also detected in some parts of the east and the southern swath of the  
316 Niger plain where River Sokoto confluences with the Niger River. Local increases can be  
317 observed throughout the area with exceptions from the cultivated areas where there are no  
318 changes. The period 2002 to 2012 had slight changes as large decreases in N export were  
319 detected in areas with increases especially around the south and wetland areas of the north while  
320 other areas remain relatively unchanged. Large decrease in N export within the 2012-2015  
321 period could be related to the short space of spatial comparison. Overall, spatial difference in  
322 N exports of the Sokoto-Rima basin remain largely constant with more decreases than increases  
323 and this is analogous to the nature of landcover.

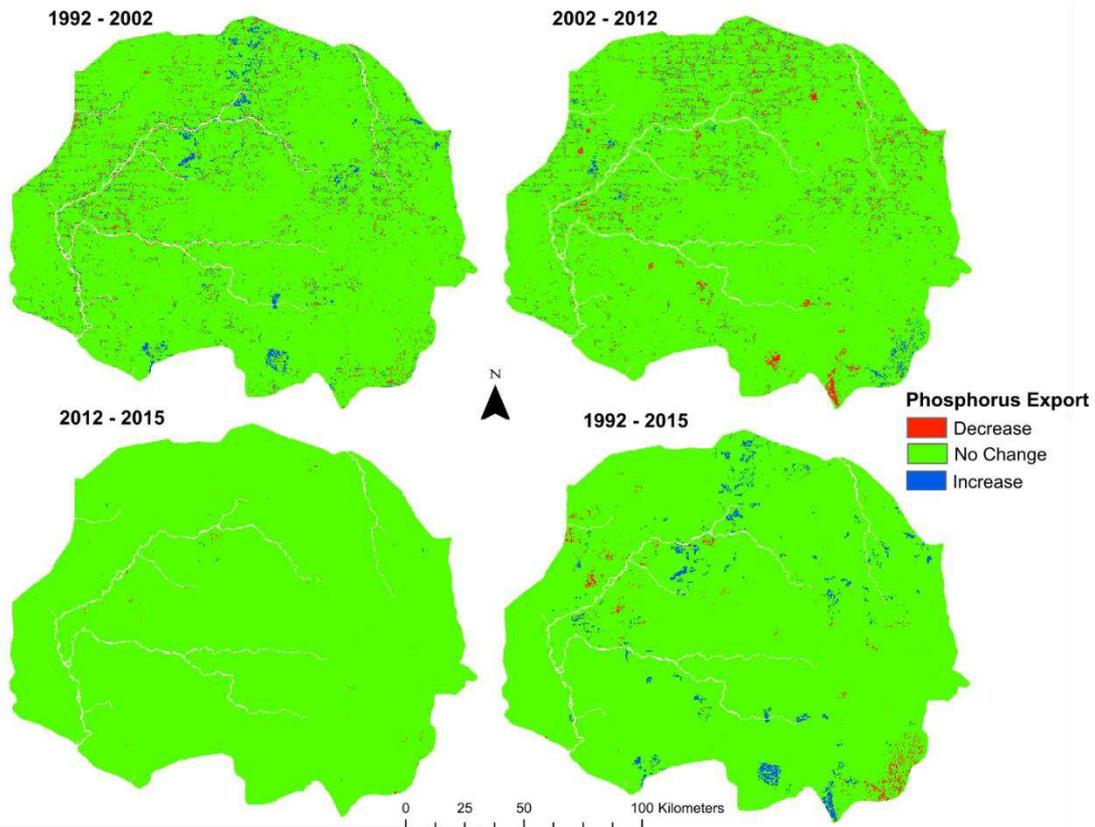


324

325 *Fig 9. Spatiotemporal variation of nitrogen export in the Sokoto-Rima basin from 1992 to*  
 326 *2015 with specific interval differences (1992 to 2002, 2002 to 2012, 2012 to 2015 and*  
 327 *cumulative spatial difference)*

328 P export across the landscape of the Sokoto-Rima basin for the study period (1992 to 2015)  
 329 showed fluctuating decreases and increases (Fig 10). Largely, P export remained unchanged in  
 330 the fashion as that of N export. However, there are locational differences across the period of  
 331 study. The decade (1992 to 2002) had increase in P export in certain areas around the north,  
 332 central and the east while spots of decreases were noted in minuscule portions. Similar  
 333 variation was observed in the period 2002 to 2012. The period 2012 to 2015 had quasi-constant  
 334 P export. Overall, there were indication of increase in P than decrease particularly in areas of  
 335 agroforestry of the north, wetland plains of the south.

336



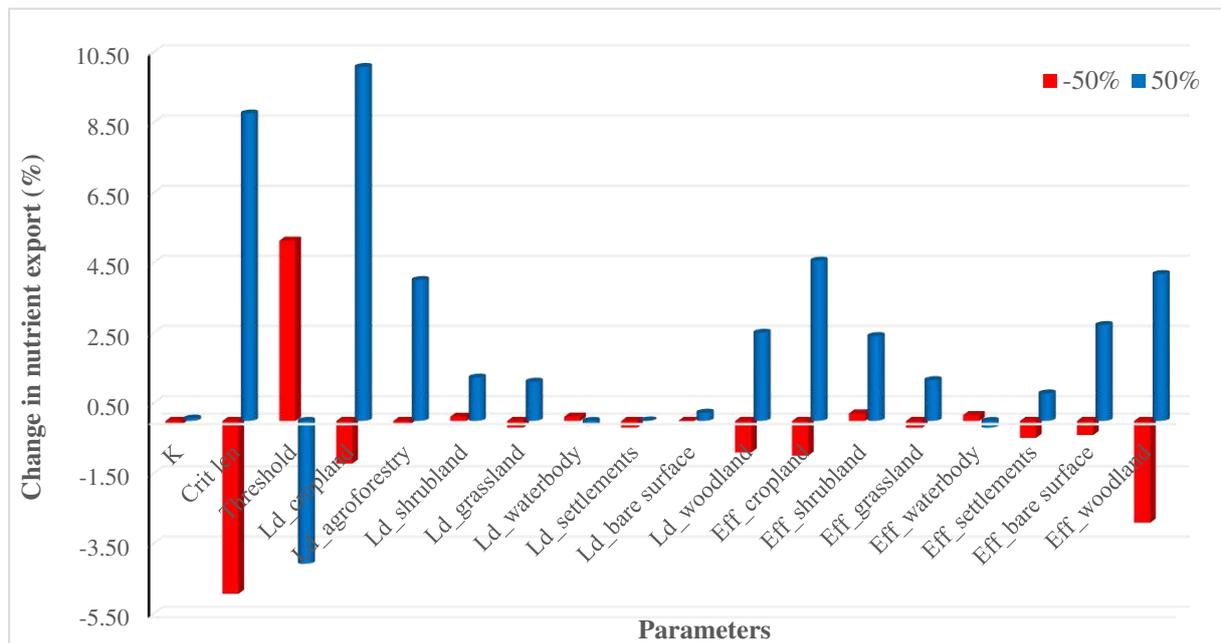
337

338 *Fig 10. Spatiotemporal variation of P export in the Sokoto-Rima basin from 1992 to 2015*  
 339 *with specific interval differences (1992 to 2002, 2002 to 2012, 2012 to 2015 and accumulative*  
 340 *spatial difference)*

### 341 **3.4 Sensitivity Analysis of Nutrient Export**

342 The linearity function of the equations utilised in deriving the spatial relationships between  
 343 nutrients and associated parameters suggests a high degree of sensitivity. This has been justified  
 344 and substantiated in Fig 11 which showed the aggregate nutrient export varied considerably  
 345 with the parameters in the Sokoto-Rima basin. The sensitivity of the nutrient export was greatest  
 346 for critical length (*Crit len*) showing the extent of elasticity such that a  $\pm 50\%$  adjustment  
 347 triggers a corresponding 94% decline and 108.76% upsurge in nutrient export. Threshold value  
 348 (*Threshold*) demonstrates a converse sensitivity to nutrient exports with a quasi-co-equal  
 349 influence in which a 50% reduction leads to increase in nutrient export while +50% increment  
 350 yields a reduction up to 95.93%. Load parameters attached to each of the landcover revealed a  
 351 direct level of sensitivity out of which cropland returned the highest nutrient export with +50%  
 352 increment leading to 110.09%. Similar sensitivity pattern was observed for loads for  
 353 agroforestry and woodland in which positive adjustment in parameter value leads to direct  
 354 change in nutrient exports. Nutrient efficiency factor across the landcover spectrum largely

355 have direct influence on change in nutrient export where cropland and woodland possesses the  
 356 most dynamic influences (Fig 11).

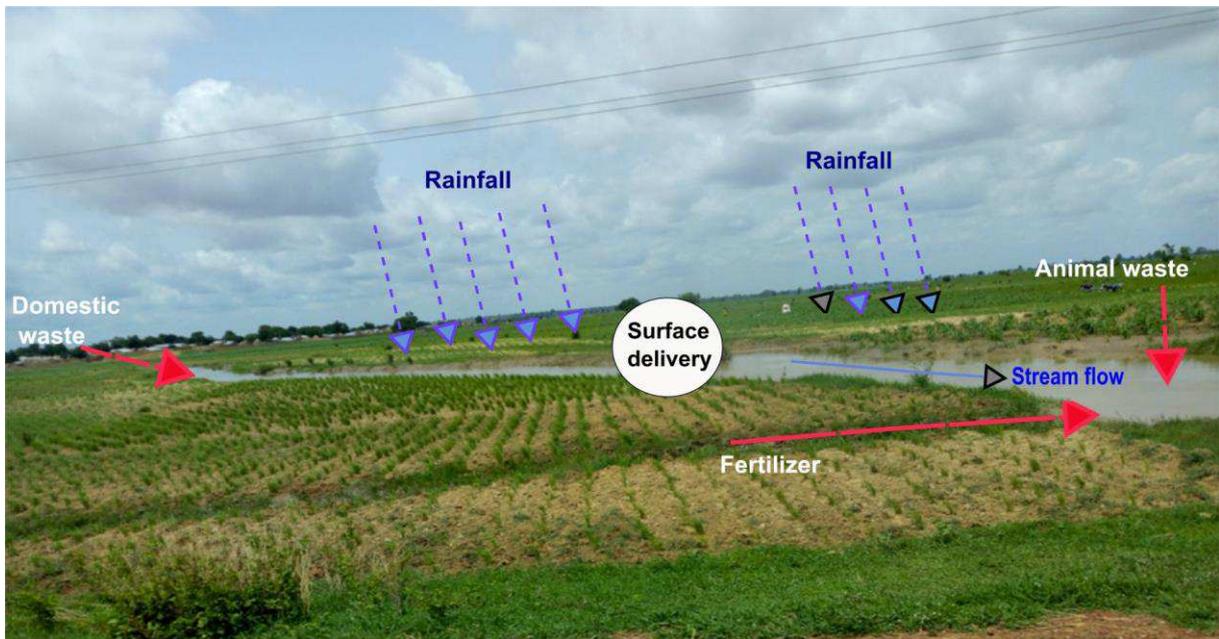


357  
 358 *Fig 11. Sensitivity as depicted by response of the aggregate nutrient export to a ±50% change*  
 359 *in selected input parameters for the entire Sokoto-Rima basin. K depicts Borselli factor, crit*  
 360 *len (critical length, in Table 1), Ld and Eff stand for loads and efficiency for respective*  
 361 *landcover classes.*

### 362 3.6 Localized Context for Nutrient Cycle

363 Nutrient cycling pathway is place-based and context-specific significantly influenced by  
 364 dynamics of nature and anthropogenic forcing. Given that the Sokoto-Rima basin is  
 365 predominantly agrarian interspersed with dispersed settlements. The spatial organization of  
 366 settlements is such that it is buffered by crop production complexes which stretches to wetlands  
 367 and plains throughout the area. Accordingly, farmland fertilization accounts for N and P  
 368 enrichment in the Sokoto-Rima basin. Related factors such as weathering of farm wastes,  
 369 domestic wastes and sewage from townships and bucolic communities as well as animal  
 370 droppings can be related. These are usually washed into rivers and streams via surface runoffs  
 371 off cultivated fields and animal production fens as well as open grazing fields where animals  
 372 freely roam and animal wastes directly enrich the soil or used as compost manure for  
 373 cultivation. Often these are washed into open water bodies leading to eutrophication problems  
 374 which have been recorded in the Sokoto-Rima basin [17-20]. Low woodland and forest cover

375 which is not uncommon for semi-arid ecosystems some vital natural landcover drivers of these  
376 as forest cover aids nutrient uptake and curtail the extent surface delivery of nutrient elements.



377

378 *Fig 12. Pathway of nutrient flow and cycling in the along the section of River Zamfara a vital*  
379 *water body of the Sokoto-Rima basin. The blue arrow and feature shows natural input source*  
380 *while the red arrow indicate the anthropogenic source of both nitrogen and phosphorus.*

#### 381 4. CONCLUSION

382 This study has shown that amounts of surficial N outweighs P in the Sokoto-Rima basin by  
383 almost 15-fold with linear increment trend from 1992 to 2015. Also, spatial distribution showed  
384 that both nutrients were directly proportional to crop cultivation areas while water bodies  
385 particularly the major rivers were identified as sinks. Subsurface nutrient loads of N and P loads  
386 produced different output in which N returned no trend and no value P returned linear increasing  
387 trend. Spatially, N loads were restricted to water bodies and P returned no spatial characterisation  
388 and variation. Nutrient exports also showed spatiotemporal variations with large amounts of N  
389 exports were observed compared to P. Cropland and agroforestry influenced roughly 90% of  
390 the amount of nutrient exported thus establishing a firm human-nature nexus in the amount of  
391 nutrient exported.

392 Management of this emerging nutrient enrichment of the landscape of the Sokoto-Rima basin  
393 require a synergistic approach whereby intensity of crop cultivation is integrated with nutrient  
394 sink approach. For instance, agroforestry and woodland advancement schemes will aid the  
395 control of the direct influence of cropland on nutrient adjustment at the local space. This

396 approach will engender managed nutrient cycling close to reality. For instance, the Nigerian  
397 section of the West African Great Green Wall programme aimed at curtailing the impact of the  
398 Sahara desert encroachment can be locally adjusted as community-based approach to enhance  
399 natural ecosystem services and by extension improve environmental resource appraisal within  
400 the Sokoto-Rima basin [20, 21].

401 Sensitivity analysis of the InVEST model adopted for this study revealed some level of  
402 uncertainties in the predictive abilities of the model despite its innovative theory and simplified  
403 approach. This shows that more extensive studies on model calibration processes, consideration  
404 of high-resolution landcover datasets, influence of parameterization should be considered vital.  
405 These are needed in the context of emerging science of nutrient modeling within the series of  
406 natural and anthropogenic factors and forcing.

#### 407 **ACKNOWLEDGEMENTS**

408 We thank the Natural Capital Project for granting access to download the InVEST software  
409 package. The efforts of European Space Agency (ESA) and Japanese Aerospace Exploration  
410 Agency (JAXA) in providing data access were kindly also acknowledged.

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# Figures

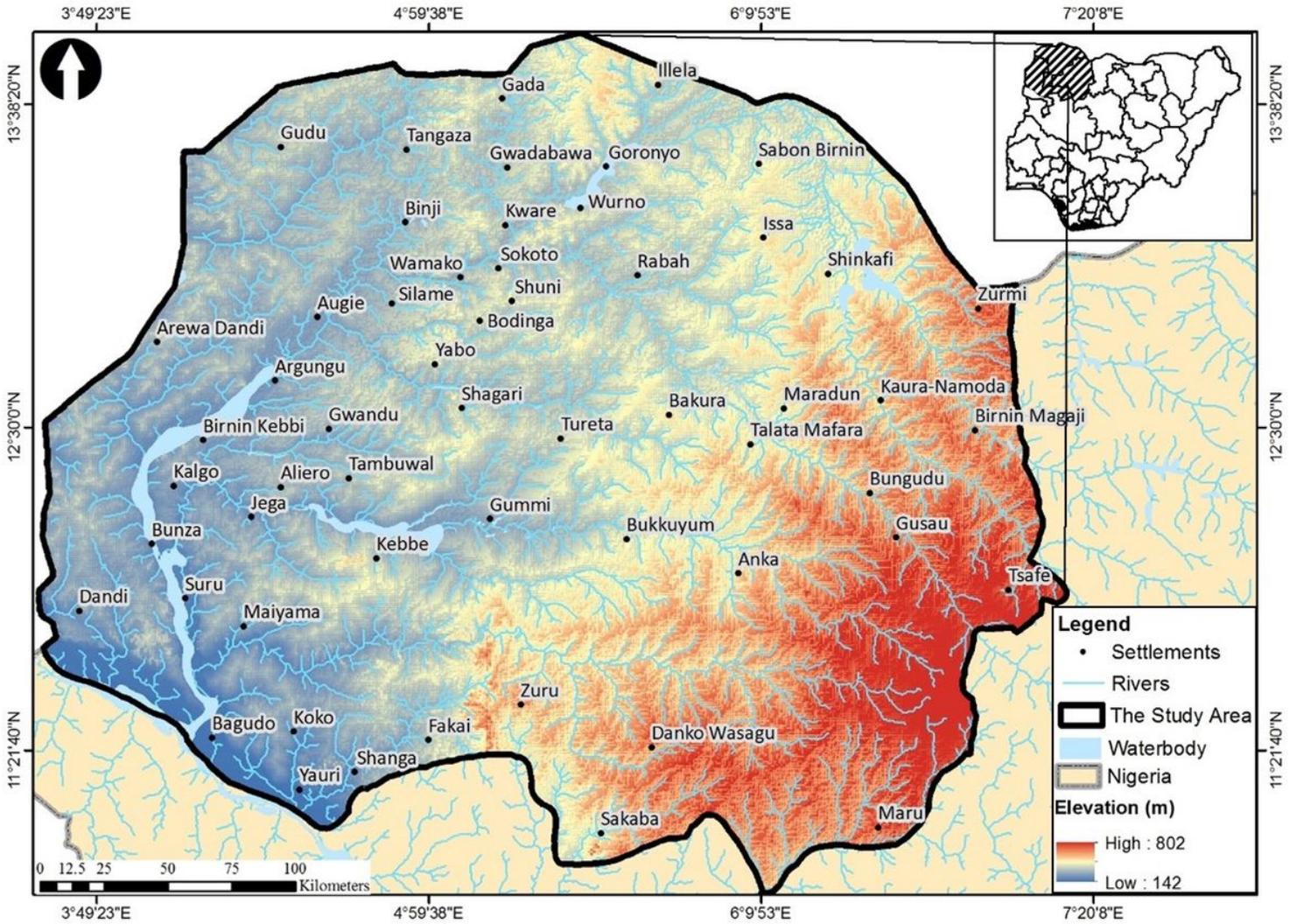


Figure 1

Geographical location of the Sokoto-Rima basin in context of northwestern part of Nigeria with the hydrological network and relief

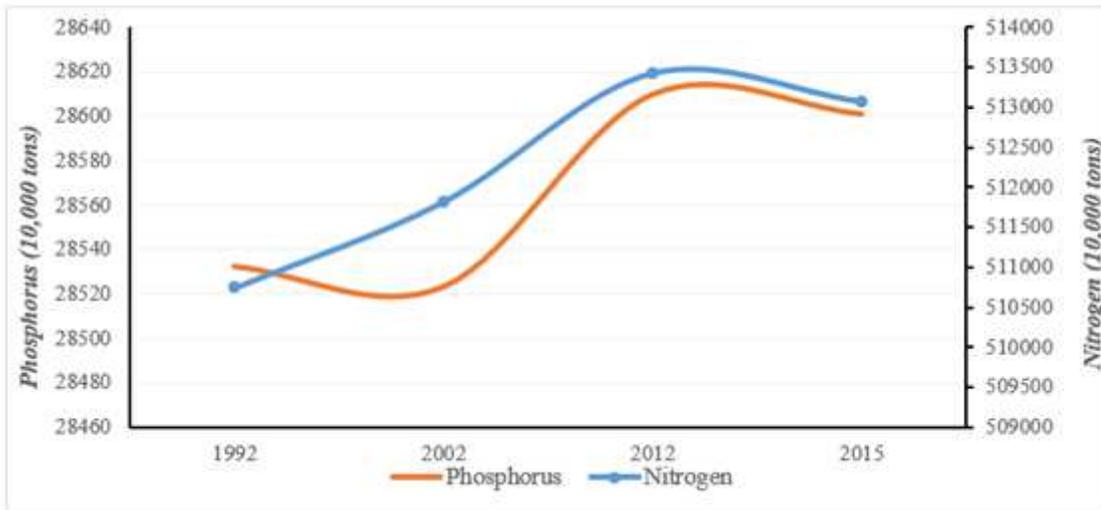


Figure 2

Temporal trend of surface loads of nitrogen and phosphorus of the Sokoto-Rima basin

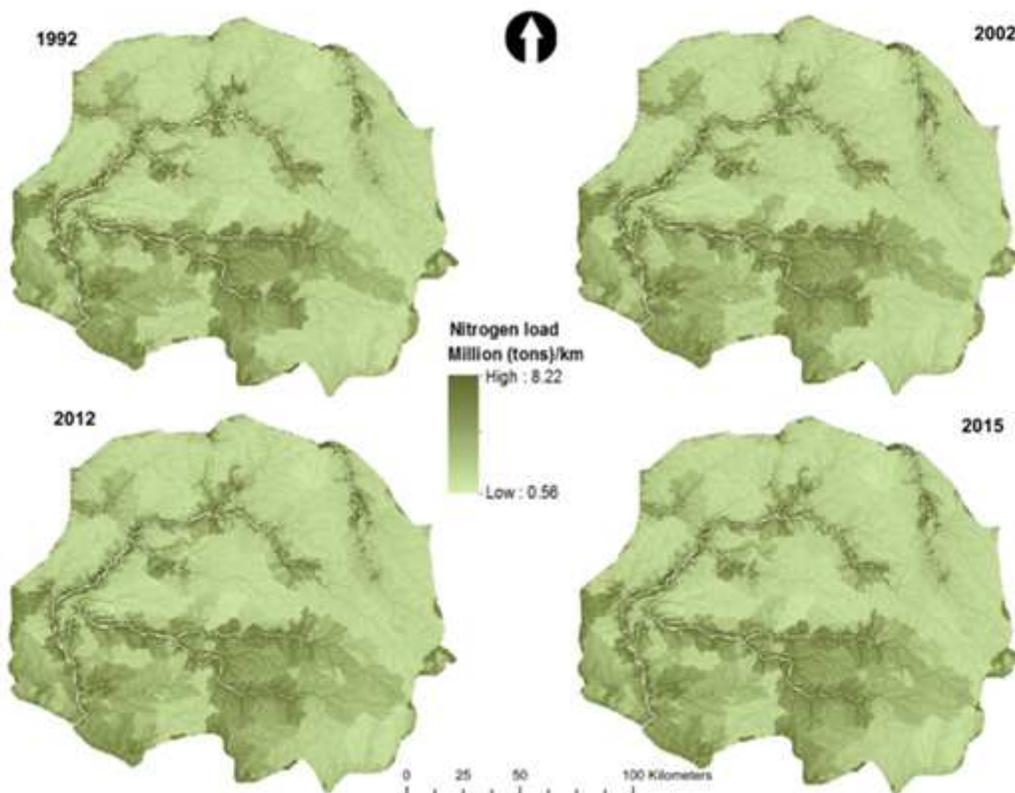


Figure 3

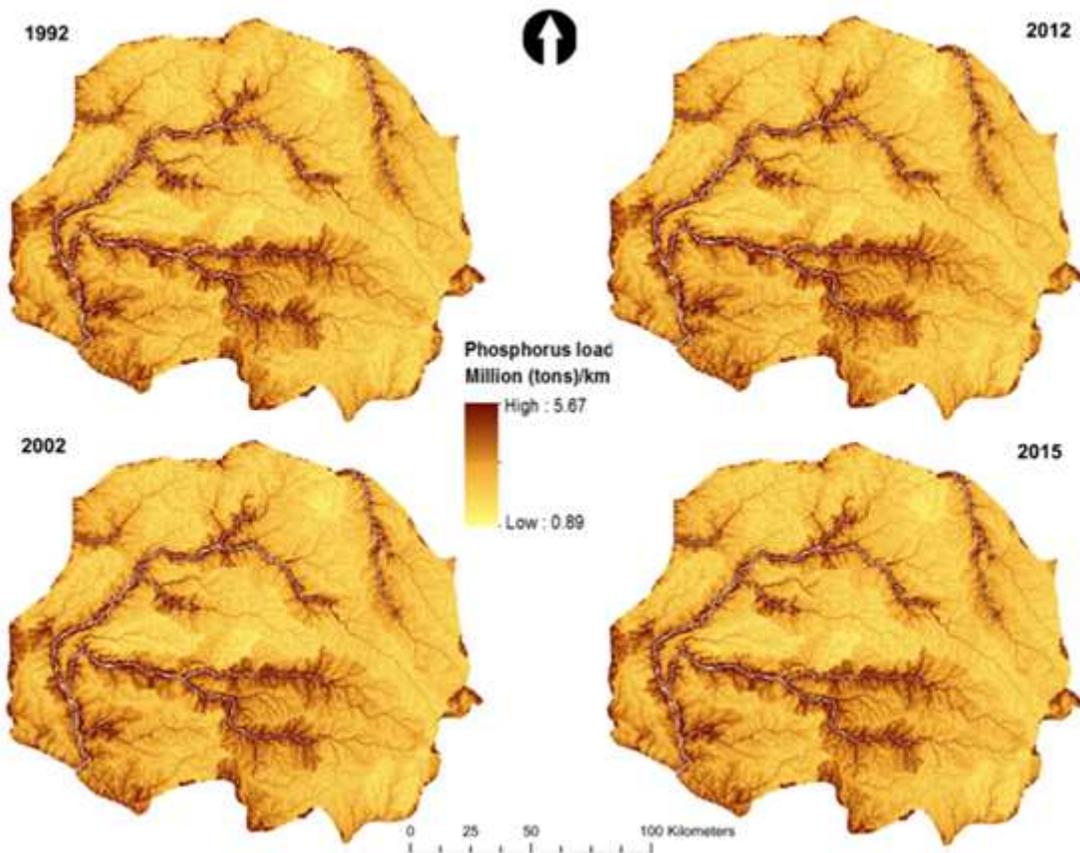


Figure 4

Spatial distribution of surficial phosphorus load in the Sokoto-Rima basin for the years 1992, 2002, 2012 and 2015.

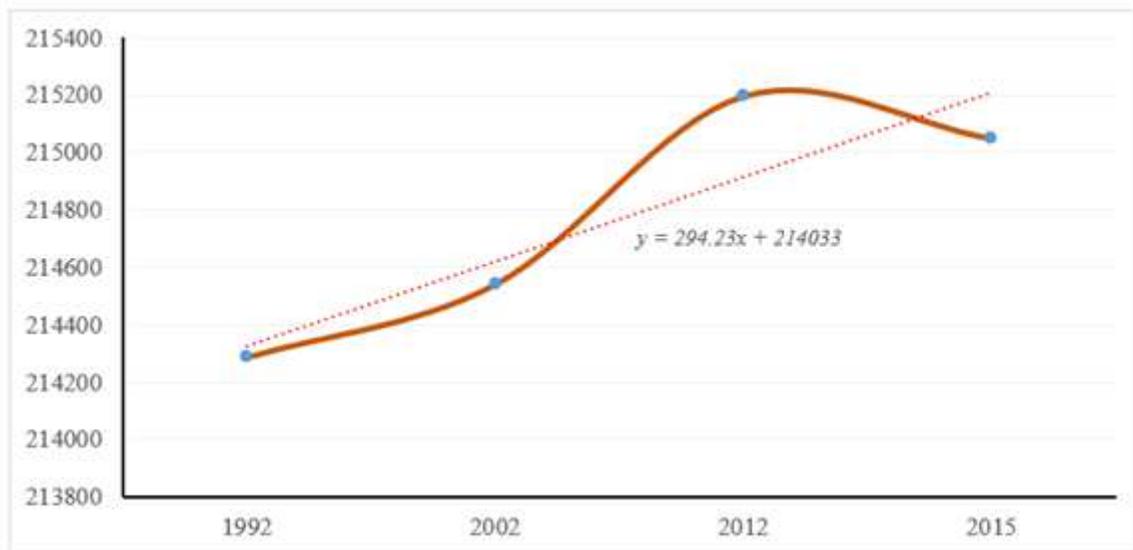


Figure 5

Trend of subsurface phosphorus load of the Sokoto-Rima basin from 1992 to 2015

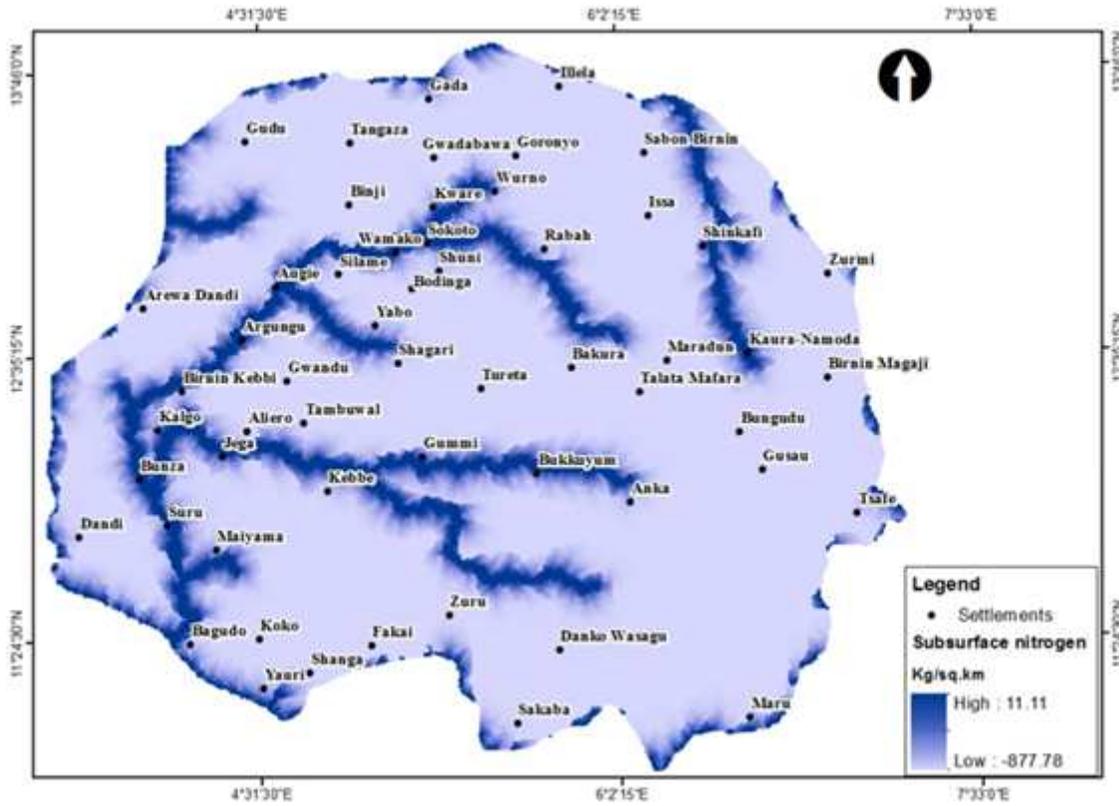


Figure 6

Spatial distribution of subsurface nitrogen loads of Sokoto-Rima basin (1992-2015)

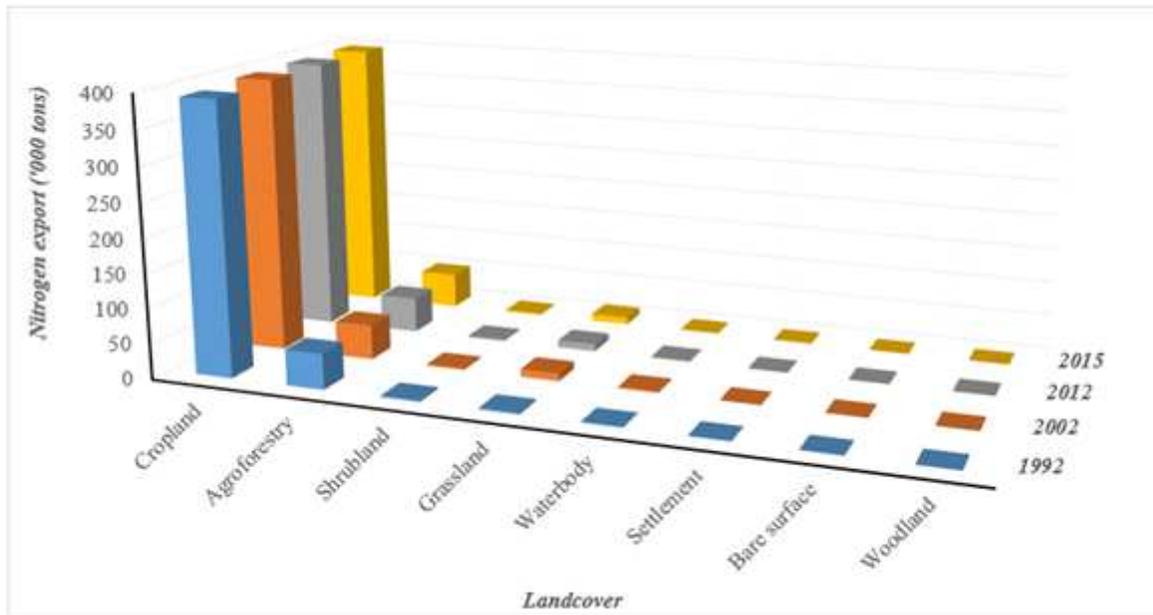


Figure 7

Nitrogen export of the Sokoto-Rima across the different landcover classes from 1992 to 2015

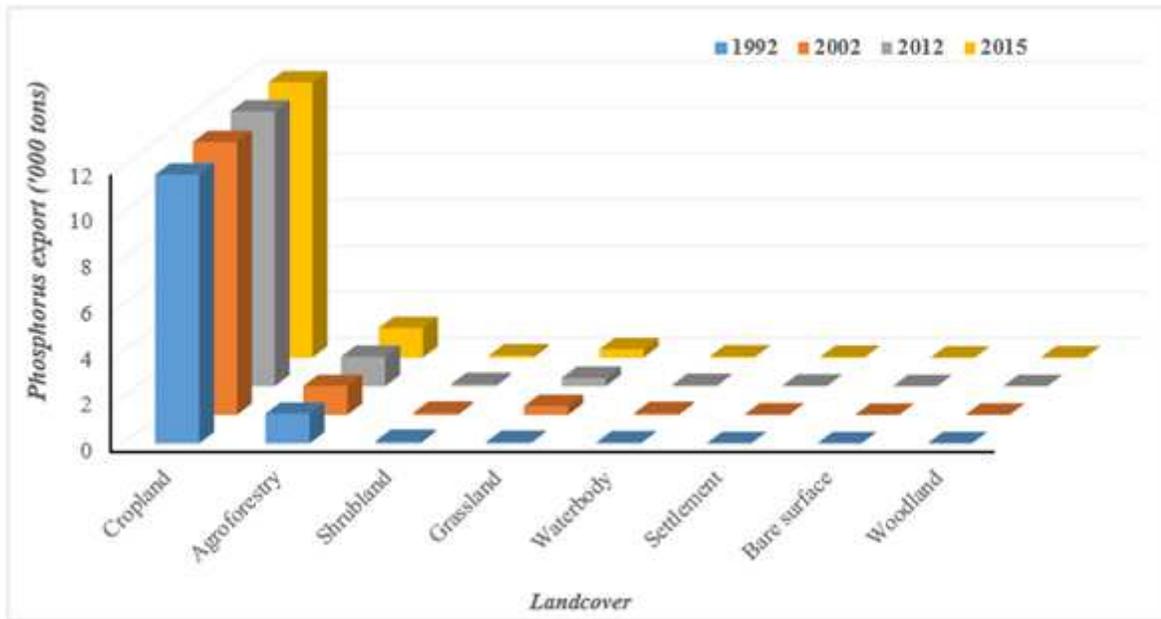


Figure 8

P export of the Sokoto-Rima across the different landcover classes from 1992 to 2015

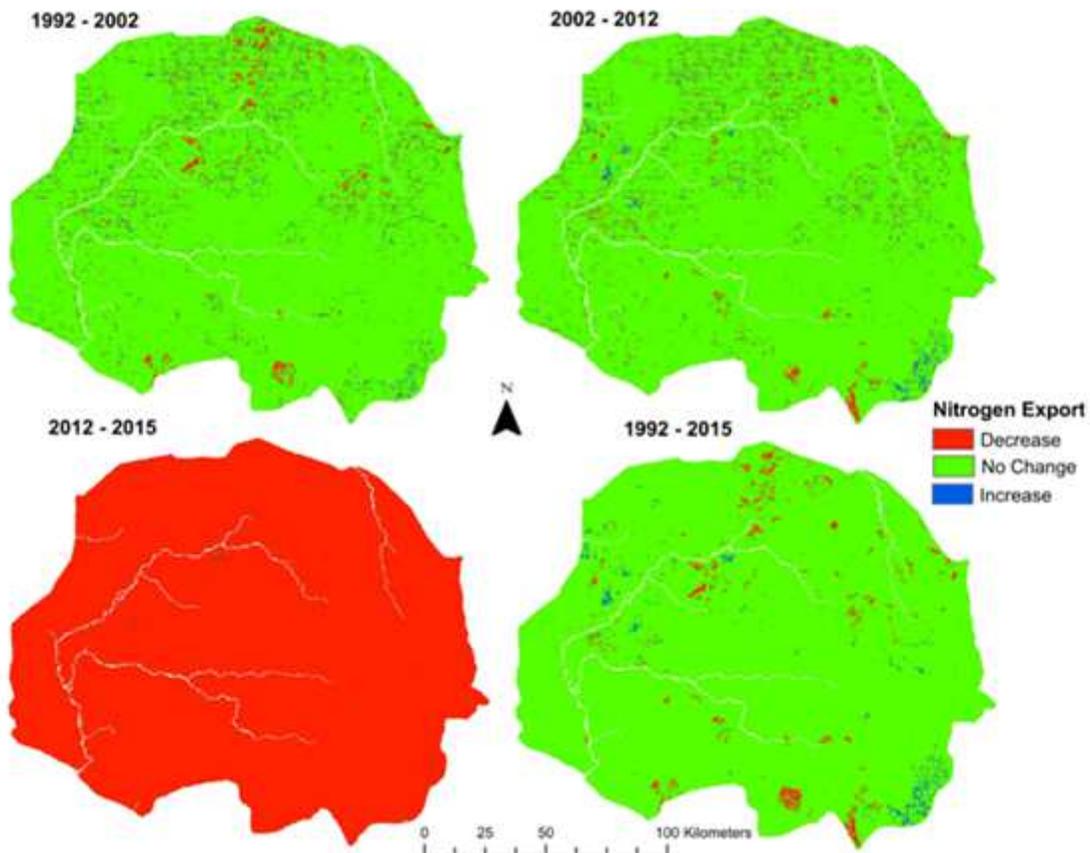
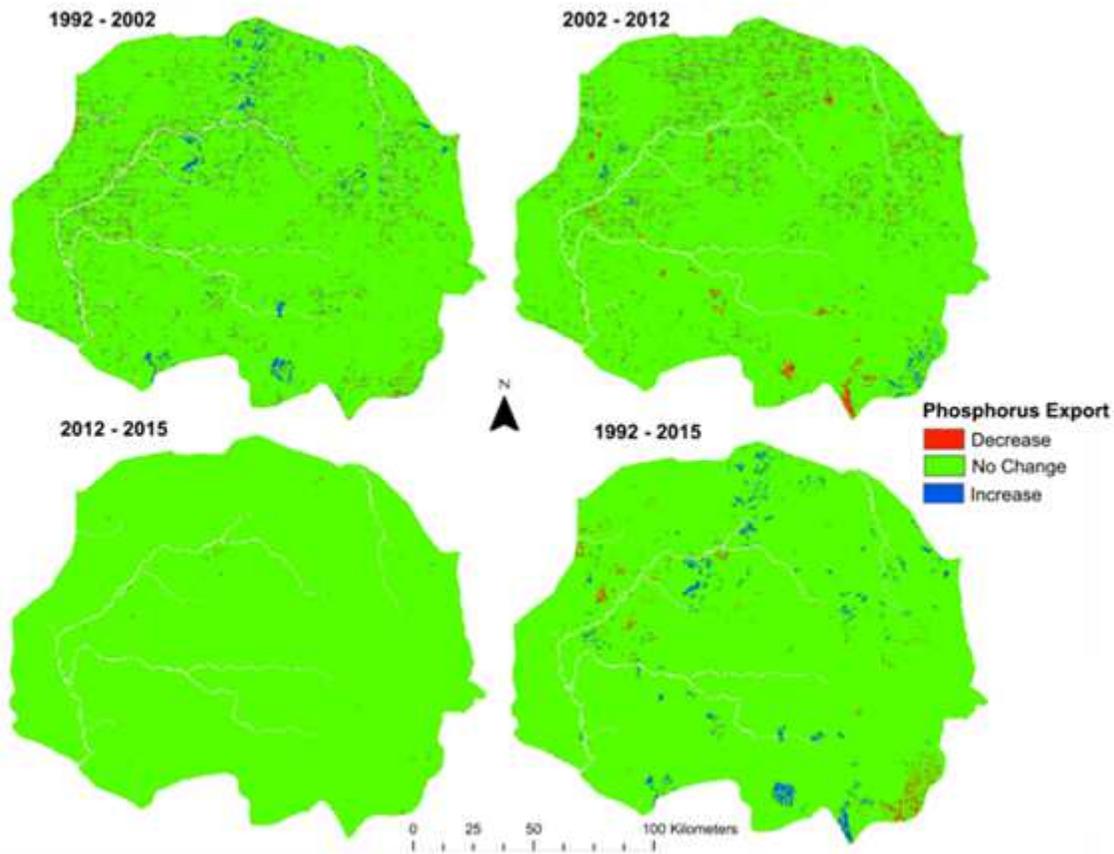


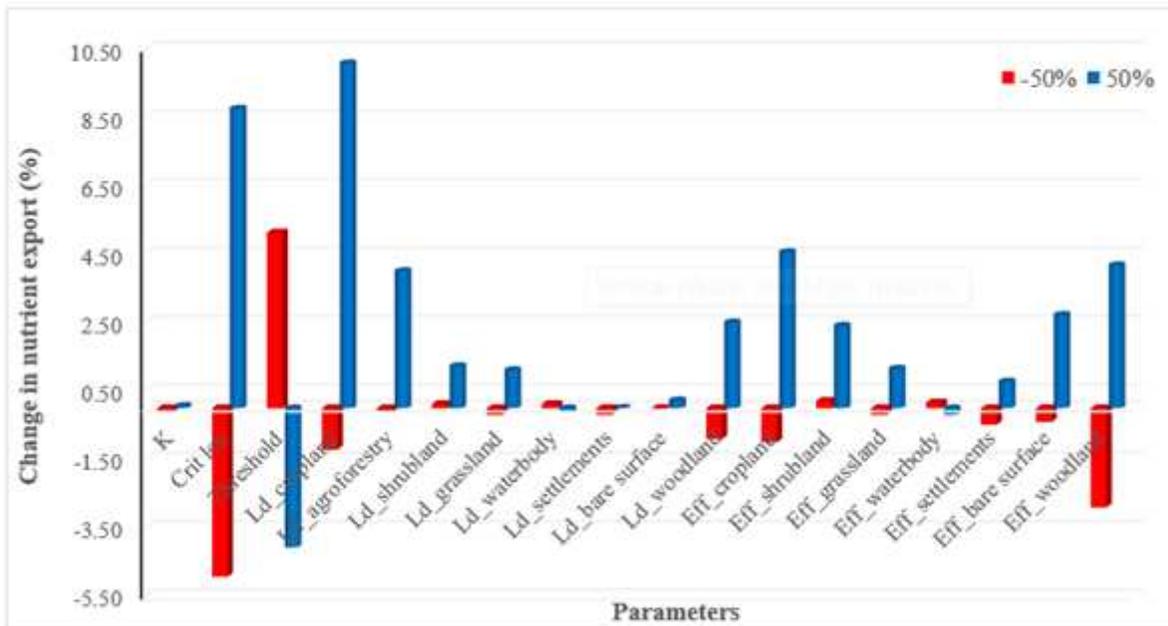
Figure 9

Spatiotemporal variation of nitrogen export in the Sokoto-Rima basin from 1992 to 2015 with specific interval differences (1992 to 2002, 2002 to 2012, 2012 to 2015 and cumulative spatial difference)



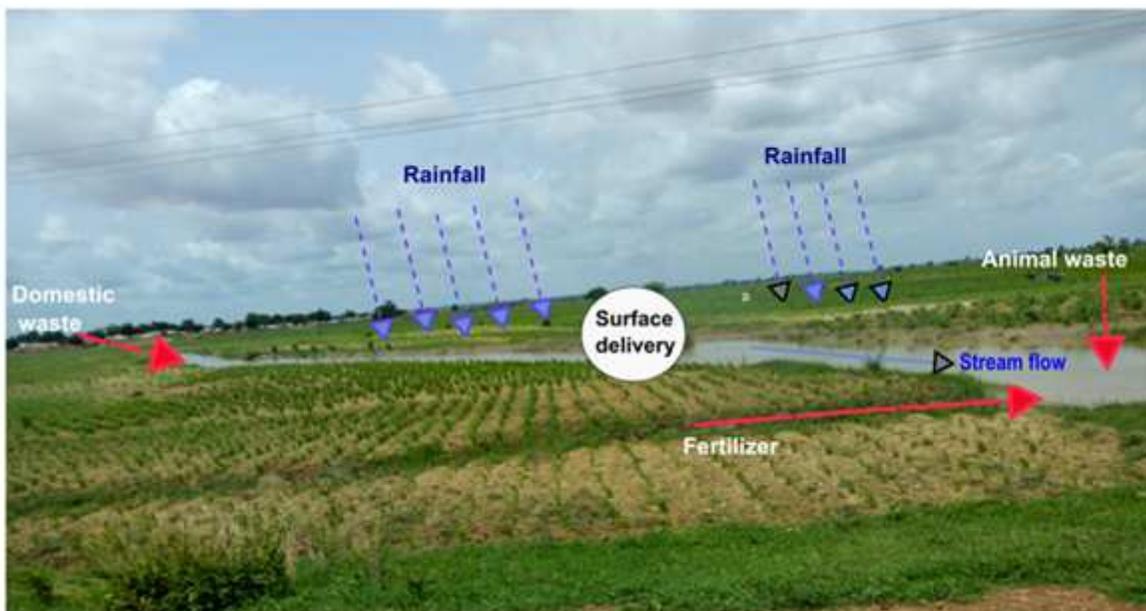
**Figure 10**

Spatiotemporal variation of P export in the Sokoto-Rima basin from 1992 to 2015 with specific interval differences (1992 to 2002, 2002 to 2012, 2012 to 2015 and accumulative spatial difference)



**Figure 11**

Sensitivity as depicted by response of the aggregate nutrient export to a  $\pm 50\%$  change in selected input parameters for the entire Sokoto-Rima basin. K depicts Borselli factor, crit len (critical length, in Table 1), Ld and Eff stand for loads and efficiency for respective landcover classes.



**Figure 12**

Pathway of nutrient flow and cycling in the along the section of River Zamfara a vital water body of the Sokoto-Rima basin. The blue arrow and feature shows natural input source while the red arrow indicate the anthropogenic source of both nitrogen and phosphorus.