AnnAGNPS Model Application for the Future Midwest Landscape Study

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- 12 13

14 Abstract: The Future Midwest Landscape (FML) project is part of the US Environmental Protection 15 Agency (EPA)'s new Ecosystem Services Research Program, undertaken to examine the variety of ways in which landscapes that include crop lands, conservation areas, wetlands, lakes, and streams 16 17 affect human well-being. The goal of the FML project is to quantify current and future ecosystem 18 services across the region and to examine changes expected to occur as a result of the growing demand 19 for biofuels. This study is one of several pilots taking place under the umbrella of the FML research 20 project. In this study, the USDA Annualized Agricultural Non-Point Source Pollution (AnnAGNPS) 21 model was applied to the East Fork Kaskaskia River watershed (289.3 km²) located in the Kaskaskia 22 River Basin within the Upper Mississippi River Basin in Illinois. The effect of different spatial 23 resolutions on model performance was investigated by comparing the observed runoff with the 24 AnnAGNPS simulated results. Alternative future scenarios such as meeting future biofuel target and 25 evaluating conservation practices were also simulated and analyzed. All delineations of the study area 26 (coarser to finer) produced satisfactory results in simulating monthly and annual runoff. However, the 27 size of the delineation does impact the simulation results. Finer delineations better represented the 28 actual landscape and captured small critical areas that would be homogenized in coarser delineation. 29 Those small critical areas are important to target to achieve maximum environment benefit. 30 Simulations of alternative future scenarios showed that as corn production increases to meet future 31 biofuel needs, total nitrogen loss increases. Conservation practices are needed to reduce total nitrogen 32 loss from the watershed. Simulations of split fertilizer application vs. one time application showed that 33 split fertilizer application reduced nitrogen loss by about 20%. Additional conservation practices such 34 as constructed wetland should be implemented for further nitrogen loss reduction. However, the model 35 can not simulate the benefit would accrue through implementation of the wetland as run for this study. 36 This study provides an important foundation for the larger FML region modeling effort by addressing 37 challenging FML landscape modeling issues such as model selection, need for further model 38 development, and spatial resolution.

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40 Keywords: Future Midwest Landscape study — AnnAGNPS— watershed modeling— runoff,

- 41 sediment, nitrogen and phosphorous simulation— Conservation practices.
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43 The Future Midwest Landscape (FML) study is part of the US Environmental Protection 44 Agency (EPA)'s new Ecosystem Services Research Program, undertaken to examine the variety of 45 ways in which landscapes that include crop lands, conservation areas, wetlands, lakes, and streams 46 affect human well-being. The goal of the FML project is to quantify current ecosystem services across the Midwest region and to examine changes expected to occur as a result of the growing demand for 47 48 Studies are also being conducted to seek alternative management options to mitigate biofuels. 49 degradation of ecosystem services caused by meeting future biofuel production goals through 50 implementation of conservation programs.

Various conservation programs have been adopted to reduce sediment and pollutant losses from 51 52 agricultural areas. Data on how conservation programs and practices are affecting ecosystem services 53 are needed to help decision makers determine a cost/benefit ratio of conservation program 54 implementation. Monitoring programs are often used to evaluate land management effects on non-55 point source pollution (Shih et al., 1994). Long-term monitoring better reflects multi-year climatic variability and helps assure that a range of events and conditions are covered (Stone et al., 2000; Borah 56 57 et al., 2003). Because long-term monitoring is expensive and often limited by personnel and financial 58 resources, short-term monitoring with complimentary simulation modeling may be used as an 59 alternative for watershed evaluation.

60 Models such as the USDA-Agricultural Research Service (ARS) Annualized Agricultural Non-61 Point Source Pollution model (AnnAGNPS) (Bingner et al., 2003) have been developed to aid in the 62 evaluation of watershed response to agricultural management practices. Through a continuous 63 simulation of runoff, sediment and pollutant loadings from watersheds, conservation programs can be 64 evaluated. Many studies have demonstrated AnnAGNPS's capability in predicting runoff, sediment 65 and nutrient losses (Yuan et al., 2001; Yuan et al., 2003; Suttles et al., 2003; Baginska et al., 2003; Yuan et al., 2005; Shrestha et al., 2006; Licciardello et al., 2007). However, all those AnnAGNPS 66 applications were performed at relatively small watersheds, for which the watershed can be delineated 67 68 as detail as needed to account for the variation of landuse and soil as well as the need for implementing 69 conservation practices while remaining computational feasible. The FML study area includes 12 states 70 of the USA, and to apply AnnAGNPS at larger watersheds, the level of detail a model represents has to 71 be optimized because of the limitation on computational power of a computer. Thus, there is a need to 72 evaluate the level of spatial detail a model represents on the accuracy of model results.

The overall objectives of this study were: 1) to explore the applicability of the AnnAGNPS model on a large scale through exploring the model spatial resolutions and accuracy; 2) to apply the model to current and future landscape scenarios to look at potential runoff, sediment and nutrient loading changes caused by meeting the 2022 biofuel targets; 3) to apply the model to estimate the need for conservation practices and evaluate the benefits that could be realized if appropriate conservation practices were implemented.

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Materials and Methods

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AnnAGNPS model description

81 AnnAGNPS is an advanced simulation model developed by the USDA-ARS and NRCS to 82 help evaluate watershed response to agricultural management practices (Bingner et al., 2003). It is a continuous simulation, daily time step, pollutant loading model designed to simulate water, sediment 83 84 and chemical movement from agricultural watersheds (Bingner et al., 2003). The AnnAGNPS model 85 evolved from the original single event AGNPS model (Young et al., 1989), but includes significantly 86 more advanced features than AGNPS. The spatial variability of soils, land use, and topography within 87 a watershed can be determined by dividing the watershed into many user-specified, homogeneous, drainage-area-determined cells. From individual cells, runoff, sediment and associated chemicals can 88 89 be predicted from precipitation events that include rainfall, snowmelt and irrigation. AnnAGNPS

90 simulates runoff, sediment, nutrients and pesticides leaving the land surface and being transported 91 through the watershed channel system to the watershed outlet on a daily time step basis. The model 92 routes the physical and chemical constituents from each AnnAGNPS cell into the stream network and 93 finally to the watershed outlet and has the capability to identify the sources of pollutants at their origin 94 and track them as they move through the watershed system. The complete suite of AnnAGNPS model, 95 which include programs, pre and post-processors, technical documentation, and user manuals, are 96 currently available at http://www.ars.usda.gov/Research/docs.htm?docid=5199.

Required input parameters for application of the model include climate data, watershed 97 98 physical information, and land management operations such as planting, fertilizer and pesticide 99 applications, cultivation events, and harvesting (Figure 1). Daily climate information is required to account for temporal variation in weather and multiple climate files can be used to describe the spatial 100 101 variability of weather. Output files can be produced to describe runoff, sediment and nutrient loadings 102 on a daily, monthly, or yearly basis. Output information can be specified for any desired watershed source location such as specific cells, reaches, feedlots, or point sources. Additional information 103 104 describing AnnAGNPS can be found in Bingner et al. (2003).





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Figure 1. All available AnnAGNPS input data sections

USGS Stream Gauge Station 05592900 and Data Summary The USGS stream gauge station 05592900 East Fork Kaskaskia River near Sandoval (38° 41'

120 20" and 89 ° 06' 00") is located in Marion County, Illinois and is a part of the Kaskaskia River Basin 121 (figure 2) which directly drains to the Mississippi River. The USGS 05592900 drains 289.3 km², with 122 elevations ranging from 142 m to 194 m above sea level. The study area has a dominant landuse of 123 124 agriculture (61%), and major crops are corn/soybeans. The other landuse include forest (26%), urban 125 (9%), wetland (3%) and barren (1%).





Figure 2. Location of the watershed.

128 Daily total stream discharge at station 05592900 was downloaded from the U.S. Geological 129 Survey (USGS) National water Information System (NWIS). The station has a complete record from 130 1980 to 2006. The USGS monthly Water quality data were obtained from the USGS National Stream Quality accounting Network (NASQAN) for the period of 1985 to 1996. Water quality parameters 131 measured include turbidity, total N, total P and dissolved P. Baseflow Filter Program (Arnold et al., 132 133 1995; Arnold and Allen, 1999) was used to separate baseflow from total streamflow. In order to 134 estimate pollutant loadings, pollutant concentrations are needed for days when no sample result is 135 available. Therefore, statistical regression methods available in the USGS (2004) LOADEST software were used to estimate pollutant concentrations and calculate monthly and annual pollutant loadings. 136 137 Daily stream discharge together with LOADEST estimated pollutant loadings were used to evaluate 138 the performance of AnnAGNPS.

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AnnAGNPS input preparation

141 Various GIS data layers of the watershed are needed for the AnnAGNPS model. These include 142 data on land surface topography, soils, land use, stream network, and climate. Using the GIS digital 143 data layers of digital elevation model, soils, and land use, a majority of the large data input 144 requirements of AnnAGNPS were developed by using a customized ArcView GIS interface (Bingner, 2003). Inputs developed from the ArcView GIS interface include physical information of the 145 146 watershed and subwatershed (AnnAGNPS cell), such as boundary and size, land slope and slope 147 direction, and channel reach (AnnAGNPS reach) descriptions. The ArcView GIS interface also assigned a soil and land-use type to each cell by using the generated subwatershed and the soil and 148

149 land-use GIS data layers. Additional steps to provide the model with the necessary inputs included 150 developing the soil layer attributes to supplement the soil spatial layer, establishing the different crop 151 operation and management data, and providing channel hydraulic characteristics. Those inputs can be organized using the AnnAGNPS Input Editor (Bingner, 2003), a graphical user interface designed to 152 153 aid users in selecting appropriate input parameters. Management information includes various field 154 management operations such as planting, cultivation, fertilization, pesticides and harvesting, much of 155 which can be obtained from RUSLE (Renard et al., 1997) databases or from actual activities implemented. Climate data for AnnAGNPS simulation can be historically measured, synthetically 156 generated using the climate generator program (Johnson et al., 2000), or created through a combination 157 158 of the two.

159 AnnAGNPS cell and reach parameters produced with the customized ArcView GIS interface 160 depend on two stream network generation parameters which are Critical Source Area (CSA) and 161 Minimum Source Channel Length (MSCL). Usually, the finer the delineation is, the better 162 characterization of the variation of landuse and soil. To evaluate the cell sizes as subwatersheds on 163 AnnAGNPS model hydrologic and water quality predictions, various combinations of CSA and MSCL were used for watershed delineation (table 1), and numbers of cells and reaches generated from each 164 combination of CSA and MSCL values are also listed in table 1. 165

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Type of	*CSA parameter	*MSCL parameter	Number of	Number of
delineation	(hectares)	(meters)	cells	reaches
1	500	2000	48	20
2	200	500	188	76
3	100	200	367	148
4	20	40	1728	721

167 Table 1. Cell and reach numbers within the study area using different CSA and MSCL values

- 168 * CSA is Critical Source Area, and MSCL is the Minimum Source Channel Length. The total area 169 for the watershed is 28707 ha.
- 170

171 Detained soil information was obtained from the USDA-NRCS Soil Survey Geographic (SSURGO) Database (Natural Resources Conservation Service, 2009). The USGS 2001 National 172 173 Land Cover Database (NLCD) was selected as a basis for base year data layer. To differentiate crop 174 type and rotation, the USDA National Agriculture Statistical Survey (NASS) Cropland Data Layer 175 (CDL) was collected for years of 2004-2007 to expand the "Single cultivated crops" land use within 176 the NLCD into multiple cropping types and rotational information. Base year landuse information for 177 the study area is listed in table 2. Base year landuse information was also used for simulation of 1980 178 to 2006 for model evaluation. Landuses of different delineations for AnnAGNPS simulations are also

179 listed in table 2. For crop management practices, RUSLE2 crop management database downloaded at

180 http://fargo.nserl.purdue.edu/rusle2 dataweb/RUSLE2 Index.htm was used to develop the

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Model evaluation and simulations of alternative scenarios

185 The Nash-Sutcliffe coefficient of efficiency (Nash and Sutcliffe, 1970), the relative error, the Willmott index of agreement d (Willmott, 1984) and visual data analysis were used to evaluate the 186

¹⁸¹ AnnAGNPS Management Schedule Data Section. Nitrogen and P applied for major crops corn,

¹⁸² soybean and wheat are listed in table 3.

- 187 model's performance. The Nash-Sutcliffe coefficient of efficiency (NSE) ranges from minus infinity to
- 188 one, with one indicating the model is perfect (Nash and Sutcliffe, 1970). The relative error (RE) is the
- 189 ratio between the total difference and the total observed value, and it ranges from minus one to infinity.
 190 Zero indicates that there is no difference between model simulation and field observation. The smaller
- 190 Zero indicates that there is no difference between model simulation and field observation. The smaller 191 the absolute value of a relative error, the better performance of the model is. The index of agreement
- (d) was developed by Willmott (1984) as a standardized measure of the degree of model prediction
- 193 error and varies between 0 and 1. A computed value of 1 indicates a perfect agreement between the
- measured and predicted values, and 0 indicates no agreement at all (Willmott, 1984). To address how
- resolution would affect the performance of the model, Simulation results from different delineations
- resulted from various combinations of CSA and MSCL values were compared with the observed data
- 197 from the USGS gauging station. The Nash-Sutcliffe coefficient (NSE), relative error (RE) and the 198 index of agreement d were computed for all delineations.
- 198 199

200	Table 2. Landuse defined by the final GIS landuse layer and by AnnAGNPS cells of different
201	delineations.

Landuse Type	Landuse assigned to AnnAGNPS Cells (hectares)						Landuse from GIS	
	1	2	3	4		Layer (hectares)		
Corn	0	0	1.4	14.6	0.1%	780.7	2.7%	
Corn/Soybean	16582.8	18269.5	16529.9	15871.2	55.3%	11665.6	40.6%	
Corn/Wheat	0	0	0	0	0.0%	80.7	0.3%	
Soybean	0	0	0	130.3	0.5%	613.1	2.1%	
Soybean/other	0	190.0	206.8	611.1	2.1%	1704.9	5.9%	
Soybean/Wheat	0	0	160.4	277.5	1.0%	666.5	2.3%	
Wheat	0	0	0	0	0.0%	95.9	0.3%	
Grain	0	0	3.5	19.0	0.1%	239.9	0.8%	
Pasture/Hay	0	43.7	0	244.3	0.9%	896.0	3.1%	
Fallow/idle	0	292.4	264.1	603.1	2.1%	721.3	2.5%	
Barren	0	0	8.5	0.6	0.0%	209.3	0.7%	
Forest	12124.9	9687.0	11075.0	9862.4	34.4%	7555.6	26.3%	
Developed	0	215.1	448.0	870.9	3.0%	2637.7	9.2%	
Wetland	0	0	0	0	0.0%	11.3	0.0%	
Flood plain	0	10.1	10.1	96.1	0.3%	693.4	2.4%	
Open Water	0	0	0	106.6	0.4%	136.0	0.5%	
Total	28707.7	28707.7	28707.7	28707.7	100%	28707.7	100%	

Table 3. Fertilizer application for base year and biofuel target scenarios (All fertilizers were one time
 application and applied before planting)

	Application Rate (kg/ha.)				
Crop Name	Nitrogen (N)	Phosphorus (P ₂ O ₅)			
Corn	165.3	72.5			
Soybean	4.5	17.4			
Wheat	115.5	76.8			

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206 After AnnAGNPS simulations were evaluated based on the observed data from the USGS

207 gauging station, AnnAGNPS simulation was performed to estimate runoff, sediment and nutrient

transport in the watershed for the base year (BY) scenario. Results from this simulation were used as a

209 baseline or a reference for additional simulations of biofuel target (BT) scenarios to meet the biofuel

210 target as well as to evaluate the impact of biofuel production on water quality. The final scenario,

multiple service (MS) simulations were performed to look for strategies to reduce nutrient loadings 211

212 from the study area.

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Results and Discussion

215 AnnAGNPS simulated monthly runoff and annual runoff from delineation 4 (CSA=20, 216 MSCL=40), and the observed monthly runoff and annual runoff at the USGS gauging station are 217 displayed in figures 3 and 4. Calculated NSE, RE and the index of agreement d are also shown in 218 figures 3 and 4. AnnAGNPS simulated monthly runoff and annual runoff from other delineations 219 (figures not shown) were also compared with the observed monthly runoff and annual runoff at the 220 USGS gauging station, and the calculated NSE, RE and the index of agreement d are given in table 4. 221 AnnAGNPS simulated annual total N and annual total N computed using the observed daily stream 222 flow and observed monthly total N concentrations are displayed in figure 5, and AnnAGNPS simulated 223 annual total P and annual total P computed using the observed daily stream flow and observed monthly total P concentrations are displayed in figure 6. NSE, RE and the index of agreement were not 224 calculated because N and P concentration at a monthly interval is not good enough for model 225 226 calibration and evaluation (Rode and Suhr, 2007). Results of BY simulation from different 227 delineations are given in table 5. Results from alternative scenario simulations are given in table 6.

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229	Table 4.	Monthly and	Annual runot	f comparisons	for different	delineations
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	Table 4.	Monthly and	l Annual runoff	comparisons	for different	delineations
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Type of	Monthly comparison			Annual Comparison			Number of
delineation	NSE	RE (%)	d	NSE	RE	d	cells
1	0.73	16	0.91	0.76	8	0.93	48
2	0.73	8	0.92	0.76	8	0.93	188
3	0.73	13	0.91	0.76	8	0.93	367
4	0.73	10	0.91	0.76	8	0.93	1728

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Table 5. Annual average over the entire watershed based on a 30-year simulation for BY scenario

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Type of	Runoff	Sediment	Total N	Total P	Number of
delineation	(mm/year)	(Tons/ha/yr)	(kg/ha/yr)	(kg/ha/yr)	cells
1	184.5	1.35	11.3	0.33	48
2	201.2	1.34	12.8	0.41	188
3	190.6	1.02	11.3	0.38	367
4	195.9	0.71	11.2	0.36	1728

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Figure 3. Comparison of observed and simulated monthly runoff for the period of 1980 to 2006.

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Model evaluation

Comparisons between the simulated and observed monthly runoff at the USGS gauging station
 produced a NSE of 0.73, RE of 0.1 and index of agreement d of 0.91 (figure 3). Comparisons between
 the simulated and observed annual runoff at the USGS gauging station produced a NSE of 0.76, RE of
 0.1 and index of agreement d of 0.93 (figure 4). Moriasi et al. (2007) thoroughly reviewed literature on

model application and recommended model evaluation methods, and they concluded that model simulation can be judged as satisfactory if NSE is greater than 0.50; very good if NSE is greater than 0.75 for runoff. Because of the overall good model performance as values of NSE, RE and index of agreement d shown in figures 3 and 4, no further model calibration was performed. This analysis reflects the capability of AnnAGNPS to estimate runoff that would be typical for ungauged watersheds, where data for calibration are usually not available.



Figure 5. Comparison of observed and simulated total nitrogen load from the USGS gauging station





259 Figure 6. Comparison of observed and simulated total phosphorus load from the USGS gauging station

Comparisons of simulated monthly and annual runoff from other delineations (1, 2, and 3; table 1) with observed monthly and annual runoff all produced satisfactory results (table 4).

263 No calibration and validation was performed for total N and P because of uncertainties with the monthly water quality data (Rode and Suhr, 2007). Except the year of 1985 and 1993, simulated 265 total N generally matches observed total N (figure 5). This is also true for total P (figure 6). The year 266 of 1985 and 1993 had the highest observed flow (figure 4) which determined the high total N and P loading based on the LOADEST program. However, 116 kg/ha in 1985 is high comparing with the 267 268 fertilizer application (table 3).

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Watershed simulation of BY, BT and MS Scenarios

271 The 30-year simulation of BY with AnnAGNPS produced an annual average runoff of 195.9 mm, annual average sediment loss of 0.71 Mg/ha, annual average total N loss of 11.3 kg/ha, and 272 273 annual average total P loss of 0.33 kg/ha over the entire watershed (table 5). Although all delineations 274 produced satisfactory results for annual and monthly runoff simulation (table 4), results of base year 275 simulation from other delineations (table 5) showed that the size of cells does impact the prediction 276 results. The prediction results are impacted by how different delineations can accurately represent the 277 actual landuse (table 2). Delineation 4 represented the actual landuse more closely than the other three 278 delineations (table 2). However, the differences still exist between the real landuse and the landuse 279 represented by delineation 4. For example, small percentage of landuse such as corn/wheat can not be 280 captured by delineation 4. Further finer delineations would be possible to capture more actual landuse, 281 but it would require significant more computational time. Delineation 2 produced the most amount of 282 runoff because the delineation 2 had the most amount of cropland and the least amount of forest land 283 (table 2). In contrast, delineation 1 produced the least amount of runoff because the delineation 1 had 284 the most amount of forest land (table 2). Delineation 2 also produced the most amount of total N and 285 total P loss because of the most amount of cropland it represented.

286 As shown in table 6, as corn production increases, total N loss increases. Converting all 287 soybean production (130.3 ha.) to corn (BT_1) would result in 1% increase of total N; Converting one 288 third of corn/sovbean rotation (5290.4 ha.) to monoculture corn would result in 33% increase of total N 289 loss. Total N loss would be more than doubled if converting all corn/soybean rotation (15871.2 ha.) to 290 monoculture corn (BT_4 in table 6) comparing with the base year total N loss. From BT_1 to BT_5, 291 corn production increases, so does the total N loss. BT_5 had a total N loss of 25.7 kg/ha. Because of 292 the high total N loss resulting from the increases of corn production, additional management options 293 must be sought to reduce total N loss from the study area. Simulation results (table 6) show that total 294 N loss can be reduced by 20% by split N application (comparing MS_1 with BT_5).

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Conclusions

297 AnnAGNPS runoff simulations of different delineations of watershed all produced satisfactory results comparing with the USGS observed runoff. However, cell size from different delineations does 298 299 impact simulation results. The watershed should be delineated as detail as possible within the 300 computation power because finer delineations better represented the actual landscape and captured 301 small critical areas that would be homogenized in coarser delineation. Those small critical areas are 302 important to target to achieve maximum environment benefit. As corn production increases to meet 303 future biofuel needs, total nitrogen loss increases. Simulations of split fertilizer application vs. one 304 time application showed that split fertilizer application could reduce nitrogen loss by about 20%. The 305 model needs to be further enhanced to simulate additional conservation practices such as constructed 306 wetland and riparian buffer for nitrogen loss reduction.

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Table 6. Summary of simulation results for alternative BT scenarios (results reported in the table are
 based on delineation 4).

Scenari	os	Runoff	Total	Total	Total
		Volume	Sediment	Nitrogen	Phosphorus
ID	Description	[mm]	Loading	Loading	Loading
	-		[T/ha/yr]	[Kg/ha/yr]	[Kg/ha/yr]
BY	Base Year	195.9	0.71	11.2	0.36
BT_1	All soybean (130.3 ha.) represented	196.0	0.71	11.3	0.36
	0.5% of the entire study area by				
	AnnAGNPS converted to corn				
BT_2	1/3 of corn/soybean rotation	196.2	0.65	16.1	0.29
	(5290.4 ha.) represented 18.4% of				
	the entire study area by				
	AnnAGNPS converted to				
	monoculture corn				
BT_3	2/3 of corn/soybean rotation	196.4	0.61	20.8	0.23
	(10580.8 ha.) represented 36.8% of				
	the entire study area by				
	AnnAGNPS converted to				
	monoculture corn				
BT_4	All corn/soybean rotation (15871.2	196.6	0.49	24.9	0.17
	ha.) represented 55.3% of the entire				
	study area by AnnAGNPS				
	converted to monoculture corn				
BT_5	All fallow/idle (603.1 ha.)	197.4	0.53	25.7	0.18
	represented 2.1% of the entire study				
	area by AnnAGNPS converted to				
	corn				
MS_1	Split fertilizer application	197.4	0.60	21.1	0.20

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