

Switchgrass Biomass Simulation at Diverse Sites in the Northern Great Plains of the U.S.

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Abstract The Agricultural Land Management Alternatives with Numerical Assessment Criteria (ALMANAC) model, originally developed and tested in Texas, needs to be tested for switchgrass (*Panicum virgatum* L.) simulation in more northerly locations. The Northern Great Plains of the U.S. has regionally adapted native populations of switchgrass and has excellent potential for growing switchgrass as a biofuel crop. The objective of this study was to adjust switchgrass parameters (potential leaf area index (DMLA) and degree days to maturity (PHU)) for northern sites and populations and to validate the model against switchgrass data from diverse sites in this region. Three or 4 years of measured yield data were used from a ten field sites in North Dakota (ND), South Dakota (SD), and Nebraska (NE). ALMANAC realistically simulated mean annual switchgrass yields ranging from means of 4.75 to 9.13 Mg ha⁻¹. Mean simulated yields were within 3%, 15%, and 9% of mean measured yields for NE, SD, and ND, respectively. Sensitivity analysis with temperature and rainfall demonstrated variable responses of potential yields depending on whether season duration, soil water, or soil nitrogen was the limiting factor at a site. ALMANAC shows promise as a useful tool for switchgrass evaluation and management in the northern Great Plains and in similar latitudes with low rainfall such as the East European Plain.

Keywords Biofuel · Degree days · Leaf area index

Abbreviations

ALMANAC	Agricultural Land Management Alternatives with Numerical Assessment Criteria
CRP	Conservation reserve program
DMLA	Potential leaf area index
GDD ₁₂	Growing degree day, base 12 C
LAI	Leaf area index
NOAA	National Oceanic and Atmospheric Administration
PHU	Degree days to maturity
PLS	Pure live seed
R1 stage	Panicle fully emerged from boot
R5 stage	Postanthesis
RUE	Radiation use efficiency
USDA-NRCS	U.S. Department of Agriculture Natural Resource Conservation Service

Introduction

Switchgrass is a highly productive, perennial grass native to much of North America. It is easily established and provides excellent wildlife habitat, protects against nutrient losses to surface water in runoff, and stabilizes soil thereby preventing soil erosion. As the U.S. and other countries have considered how to best address energy needs and soil conservation, switchgrass has risen to the forefront. Before investing large scale economic and land resources into such perennial grass systems for biomass production, process based simulation models can be used to simulate and compare impacts of different plant production systems such

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as switchgrass, maize (*Zea mays* L.), and sorghum (*Sorghum bicolor* (L.) Moench). A simulation model that can be used for parallel analyses of biofuels production efficiency, soil erosion, water quality of runoff, nutrient demands, and water use across a wide geographic region will be valuable for policy planning, environmental assessment, and determination of best management schemes. Process-based simulation models such as ALMANAC [4], that use U. S. Department of Agriculture Natural Resource Conservation Service (USDA-NRCS) soils data and National Oceanic and Atmospheric Administration (NOAA) weather data hold promise as realistic tools that can be implemented across large regions without recalibration.

The ALMANAC model has been extensively tested for semi-arid regions of the southern U.S. First, plant parameters were derived for several warm season native and improved grasses [8, 12]. The model was effective at simulating biomass production for diverse range sites in Texas [9], for improved pastures and native range sites in Texas [12], and for Alamo switchgrass at several sites in Texas, one site in Louisiana, and one site in Arkansas [5, 11]. Likewise, the model has been validated with maize and sorghum under a wide range of conditions in the U.S. [6, 7, 10, 22].

The purpose of the present study was to assess the performance of the ALMANAC model in simulating switchgrass production in the northern Great Plains from east central Nebraska to northeastern North Dakota, where biomass is often limited by an abbreviated growing season. Standardized input parameters were used, even though these regions were 6.62° to 14.96° further north than the northernmost site previously simulated in the southern U.S. for ALMANAC's switchgrass simulation validation. We then conducted sensitivity analyses for three representative sites (one per state) for runoff curve number, rainfall, and temperature. We demonstrate how output from this process-based model can be used to simulate how climate change and runoff curve numbers potentially alter switchgrass yields.

Materials and Methods

General Model Description

The ALMANAC model has been described previously, especially as relevant for switchgrass simulation [4, 5]. The model relies on readily available daily weather data and on the extensive USDA-NRCS soils data. Commonly reported values of daily maximum and minimum temperatures, rainfall, and solar radiation are needed. This enables users to apply the model throughout the U.S. by using publicly accessible soils and climate data. The model uses a daily time step to efficiently simulate an extensive range of management, plant, and soil scenarios. ALMANAC is also

capable of rapidly simulating multiple years of plant growth in a few seconds.

The ALMANAC model simulates the processes of plant growth and soil water balance, including light interception by leaves, dry matter production, and partitioning of biomass into grain (in the case of crops). ALMANAC simulates leaf area index, light interception with Beer's law, and potential daily biomass increase with a species-specific value of radiation use efficiency (RUE). The daily increases in leaf area index (LAI) and biomass are reduced when plant available water in the current rooting depth is insufficient to meet potential evapotranspiration. Plant development is temperature driven, with duration of growth stages dependent on degree days. Each plant species has a defined base temperature and optimum temperature. For this study, switchgrass was assumed to have a base temperature of 12°C [18] and an optimum temperature of 25°C.

ALMANAC includes a generic LAI function. The maximum LAI of a crop species at high planting density is input. This potential LAI is reduced as a function of planting density. The development of LAI as a function of fraction of seasonal degree day sum follows a sigmoid curve, with two input parameters defining the curve. Daily increments of LAI growth can be reduced by water stress.

Model Evaluation At Ten Sites

Demonstration Data Sets

The data described herein were collected at a total of ten locations across Nebraska (NE), South Dakota (SD), and North Dakota (ND) as described by Schmer et al. [15] and Perrin et al. [14]. Soil types, planting methods, and climatic data are reported in these references. Switchgrass grown as a biomass energy crop would be economically feasible in the ten study locations [20]. Fields were chosen based on characteristics of the region and qualifications in the Conservation Reserve Program. Staff from the USDA-NRCS in NE, SD, and ND assisted with identifying potential cooperators and field sites. Field size ranged from 3 to 9.5 ha with an average of 6.7 ha. Farm cooperators managed all aspects of crop production and harvest, except at the Nebraska switchgrass fields which were planted by USDA-ARS Lincoln Grain, Forage and Bioenergy Project personnel. Nebraska locations were planted in 2000 with the exception of the Atkinson, NE location being replanted in 2001 because of stand failure caused by drought. The South Dakota and North Dakota locations were established in 2001.

A general set of recommended management practices based on previous small plot research were given to all farm cooperators [19]. These management practices detailed seedbed preparation, planting depth, planting dates, herbicide use, and harvesting dates. Populations selected for each field

were based on prior research within respective geographical regions. Seeding rates were 322 pure live seed (PLS) m^{-2} . Switchgrass populations used in the study were ‘Cave-in-Rock’, ‘Trailblazer’, ‘Shawnee’, and ‘Sunburst’. The selected populations were primarily developed for pastures. These data provided an excellent test of switchgrass simulation by ALMANAC due to the diversity of populations, soil types, and climatic conditions. In each case, the model was parameterized by site using the site’s soil type and the nearest available weather data. The degree day sums for the grass to mature each year (PHU) (base temperature of 12°C for switchgrass) were calculated using temperature data for each site. Standardized PHU values were 1100, 800, and 600 for NE, SD, and ND, respectively. The potential leaf area index (DMLA) was assumed to be 3.3 in all cases, which was lower than the leaf area index used previously in the southern U.S. [5, 11]. All other switchgrass parameters were identical to those used previously.

The model was validated against the measured biomass values for the last 4 years in established stands (3 years for Atkinson, NE and Huron, SD due to fewer measured years). Thus, low LAI and low productivity values associated with the initial establishment year were not included in the validation.

At each of the ten sites, biomass yields were estimated in 16 quadrats using a 1×1-m frame in 2000 and a 0.3×3.66-m frame (1.1- m^2) in 2001 to 2006. Biomass yields were measured at the plant maturity stage of R1 to R5 [13] (panicle fully emerged from boot to postanthesis) or after a killing frost. Total plant biomass within the frame was clipped to a 10-cm stubble height and weighed using a portable electronic scale (Intercomp CS750, Minneapolis, MN). A subsample was taken from each sample site to determine dry mass. After quadrat sampling was conducted, fields were mechanically harvested and baled. Most cooperators chose to harvest at emerged inflorescence to post-anthesis (early to mid-August) in post-establishment years, except for the Bristol, SD and Munich, ND locations, which were harvested after a killing frost.

Sensitivity Analyses at Three Sites

Three sites were selected for sensitivity analyses: Douglas, NE; Bristol, SD; and Streeter, ND. Thirteen years of measured weather were used for each set of simulations. Mean annual rainfall for the 13 years at these sites were 845 mm for Douglas (1987–1999), 684 mm at Bristol (1988–2000), and 609 mm at Streeter (1989–2001). Initial values for soil moisture and soil nutrients can dramatically affect the simulated switchgrass yields in the first few years of a multi-year simulation. When running long term simulations, such possible sources of error can be avoided by including some additional simulation years at the start of

the simulations, to allow soil water and soil nitrogen to stabilize to values more typical of established switchgrass fields. Thus for this study, only the simulations for the last 10 years of the 13 were evaluated. Mean switchgrass yield for the 10 years and associated coefficients of variation (CV) were calculated. The simulations for changing runoff curve number, changing rainfall, and changing temperature all assumed 82 kg N per ha were applied each year. An additional set of simulations were done for each location to investigate rainfall effects with no nitrogen limitation (i.e. altered rainfall, 200 kg N per ha each year).

Changes in each input component were designed to test how the model predicted yield changes over a realistic range of inputs. The runoff curve number [17] is a unitless empirical parameter used to simulate how much water infiltrates into the soil and how much runs off a field. It is determined by the soil hydrologic group, the land use cover, and whether a field is terraced or contour planted. The runoff curve number, initially set to 62 for all three sites, was increased and decreased by five and ten units for a total of five treatments. For rainfall, all daily rainfall values were increased (and decreased) by 10%, 20%, and 50%. For temperature, all daily maximum and minimum temperature values were increased (and decreased) by 3°C, 6°C, and 9°C.

Results

Model Evaluation at Ten Sites

Overall, ALMANAC closely simulated measured average yields, maximum yields, and minimum yields over all locations (Table 1). The average for the mean simulated values over all locations was within 1% of the overall average measured value. For maximum values, the mean overall mean simulated was only 3% lower than the overall mean measured value. Likewise, for minimums, the overall mean simulated was only 10% lower than the overall mean measured.

The mean simulated values for each location were within 15% of mean measured yields for seven of the ten locations. The means for simulated yields were within 10% of mean measured yields for three of the four NE sites, for two of the four SD sites, and for one of the two ND sites. The mean simulated yields overall by state were within 3% of measured for NE, within 15% for SD, and within 9% for ND.

The sites with the largest differences between simulated and measured mean yields occurred at intermediate to high rainfall sites. The greatest differences occurred at an intermediate rainfall site in NE (Crofton), the highest rainfall site in SD (Huron), and the higher rainfall site in ND (Munich).

The maximum and minimum simulated yields at each location also were similar to the maximum and minimum measured yields, with maximums showing closer agree-

Table 1 Measured and simulated values of switchgrass biomass for 4 years (unless otherwise noted) at ten locations

Location (mean rain) (mm)	Mean		Max		Min	
	Msrđ Mg/ha	Sim (S/M)	Msrđ	Sim (S/M)	Msrđ	Sim (S/M)
Nebraska						
Douglas (710)	7.99	8.70 (1.08)	9.30	11.90 (1.28)	6.71	2.93 (0.44)
Lawrence (670)	5.98	5.46 (0.91)	8.11	8.86 (1.09)	4.46	3.24 (0.73)
Atkinson ^a (506)	4.97	5.30 (1.07)	7.51	6.96 (0.93)	1.53	2.72 (1.78)
Crofton (673)	6.31	5.11 (0.83)	7.29	5.23 (0.72)	4.56	4.10 (0.90)
South Dakota						
Bristol (593)	9.13	9.06 (0.99)	11.96	11.24 (0.94)	7.26	6.47 (0.89)
High (557)	4.75	5.21 (1.10)	8.48	8.00 (0.94)	1.12	2.94 (2.63)
Ethan (710)	5.25	5.81 (1.11)	7.89	7.56 (0.96)	2.44	3.39 (1.39)
Huron ^a (723)	6.01	7.23 (1.39)	8.65	9.31 (1.08)	4.85	4.87 (1.00)
North Dakota						
Streeter (440)	5.63	5.04 (0.90)	7.42	7.87 (1.06)	4.61	3.52 (0.76)
Munich (531)	6.61	5.58 (0.84)	9.79	6.46 (0.66)	4.63	4.21 (0.91)
Overall means	6.26	6.25 (1.00)	8.64	8.34 (0.97)	4.26	3.84 (0.90)

The ALMANAC model was used for simulations

Msrđ measured, Sim simulated

^a Only 3 years of values were simulated, due to fewer numbers of measured years

ment than minimums. For the maximums, the simulated values were within 15% of measured values in seven of ten locations. Only four of the ten locations had minimum simulated values within 15% of measured minimums.

The average maximum simulated yield was within 1% of the average maximum measured yield in NE, within 2% in SD, and within 11% in ND. The average simulated minimum value was within 4% of average measured in NE, 48% greater in SD, and 14% less in ND.

Sensitivity Analyses at Three Sites

Runoff curve number had little effect on yields in these short-season, low rainfall locations. This contrasts with the results of Yun Xie et al. [23], which showed that runoff curve number had a major impact on ALMANAC's simulated maize and sorghum yields for eight Texas counties. Increasing or decreasing curve number by ten units always showed less than 10% changes in yield and usually less than 5% (Table 2). These results demonstrate that the partitioning of rainfall between runoff and infiltration is relatively unimportant in such low rainfall environments.

For the two wetter locations, increasing temperature by 3°C resulted in a 10–11% increase in mean grass yield, with no further increases in yield when temperature was increased by 6°C. A 9°C increase in temperature decreased yields by 32% and 41% at the Douglas and Bristol sites, respectively. For the third, more arid location in Streeter, all increases in temperature resulted in grass yield reductions, with the 9°C increase causing a 51% reduction in mean yield. Temperature

reductions decreased mean grass yields, with the 9°C temperature decrease causing 50% (Douglas), 89% (Bristol), and 97% (Streeter) reductions in mean grass yield.

When only 82 kg N ha⁻¹ year⁻¹ was applied, the increased rainfall for the first two locations caused N deficiency to have a larger impact on grass yield than did the decreased drought, resulting in slight decreases in mean grass yield. The third, more drought limited location did show yield increases with increased rainfall amounts. When 200 kg N ha⁻¹ year⁻¹ was applied, the N deficiency was not as important for the first and third locations, where mean grass yields increased with each additional increment of rainfall. There was little effect of increased rainfall on yield in the Bristol location.

In contrast, decreased rainfall amounts for the 82 kg N per ha per year simulations usually showed decreased grass yields, with the most severe drought (50% reduction) caused a decrease in mean simulated grass yields by 23%, 25%, and 60% for the three locations. For the 200 kg N per ha per year simulations, decreased rainfall showed similar grass yield decreases for the Douglas location, but less drastic reductions for the other two.

Discussion

The ALMANAC model, with its derived parameters for the southern Great Plains and now the northern Great Plains of the U.S., offers utility as a tool for addressing a number of important environmental, economic, and food supply

Table 2 Effects of varying inputs on simulated values of switchgrass biomass for 10 years at three locations

	Douglas, NE	Bristol, SD	Streeter, ND
	Mean (CV%)	Mean (CV%)	Mean (CV%)
	Mg/ha		
Runoff curve number			
62 (original)	7.44 (23)	6.85 (56)	6.56 (36)
67	7.36 (26)	6.94 (56)	6.35 (36)
72	7.28 (31)	6.99 (53)	6.20 (36)
57	7.49 (21)	6.77 (54)	6.65 (36)
52	7.47 (23)	6.70 (54)	6.72 (36)
Temperature			
Original values	7.44 (23)	6.85 (56)	6.56 (36)
+3 C	8.21 (23)	7.63 (23)	5.65 (49)
+6 C	7.31 (34)	6.87 (29)	4.55 (53)
+9 C	5.04 (68)	4.07 (67)	3.20 (65)
-3 C	7.12 (20)	5.93 (45)	5.13 (44)
-6 C	6.78 (24)	4.00 (46)	2.65 (71)
-9 C	3.71 (49)	0.78 (105)	0.17 (166)
Rainfall (82 kg N per ha per year applied)			
Original values	7.44 (23)	6.85 (56)	6.56 (36)
+10%	7.39 (25)	6.70 (51)	7.31 (38)
+20%	7.28 (31)	6.64 (49)	7.99 (39)
+50%	7.10 (62)	6.56 (48)	9.34 (40)
-10%	7.38 (30)	6.20 (62)	5.74 (34)
-20%	7.78 (24)	6.05 (67)	4.84 (33)
-50%	5.76 (26)	5.57 (51)	2.61 (37)
Rainfall (200 kg N per ha per year applied)			
Original values	12.66 (14)	10.14 (28)	6.48 (35)
+10%	13.17 (15)	10.33 (27)	7.26 (37)
+20%	13.73 (13)	10.37 (27)	7.94 (39)
+50%	14.20 (15)	9.90 (29)	9.34 (40)
-10%	11.83 (17)	8.26 (46)	5.63 (34)
-20%	10.66 (17)	7.65 (44)	4.83 (33)
-50%	5.61 (26)	5.71 (47)	2.61 (37)

The ALMANAC model was used for simulations

related issues. The model can simulate soil erosion and nutrient losses for maize, sorghum, and switchgrass at any field site under any production system. The model can simulate long-term plant productivity and stability, to address concerns about the land area needed to supply ethanol producing facilities and the sustainability of a given cropping system. Information derived with this model will benefit economists, governmental policy planners, agronomists, and agricultural producers. It will be a valuable tool to determine tradeoffs between biofuel production, economic inputs, and environmental costs. The ALMANAC process-based model differs in form and utility from economic models previously used to simulate switchgrass such as POLYSIS [16] or BIOCOST [20, 21]. The former model was developed for evaluating regional crop production economics. BIOCOST generates budgets to calculate regional and local costs of producing bioenergy crops.

As shown in this study, ALMANAC realistically predicts switchgrass biomass production in the northern Great Plains of the U.S. The results compare favorably with simulation results for Texas, Louisiana, and Arkansas [5, 11]. In the first study, ALMANAC's simulated switchgrass yields differed from measured values by 0.4% to 15%. In the second study, simulated switchgrass yields differed from measured values by 0.5% to 1.8%. In the present study, by changing two parameters (potential LAI and degree days to maturity) the model realistically simulated biomass yield at diverse sites in ND, SD, and NE. This process based model will be useful for predicting switchgrass responses to temperature and precipitation variability across the U.S.. The varying importance of runoff curve number in these sites with different rainfall and with different lengths of growing season indicates the relative importance of this key hydrologic variable. This paper provides realistic parameters for these northern

switchgrass types for future applications and for future simulation and validation research.

The duration of growth of a given switchgrass population at a given latitude is temperature driven, with photoperiod having a variable effect among populations. As discussed above, using degree days, a given site can be characterized by its mean summed GDD₁₂ for switchgrass. Photoperiod affects populations by shortening the growth duration to less than potential for a site as northern populations are moved southward or by lengthening the growth cycle such that a population may not reach flowering or maturity, as southern populations are moved northward. This has been investigated in detail with multilocation studies with diverse sets of switchgrass populations [1, 2]. Given the complexities of plant responsiveness, the ALMANAC model, with its simple phenological routine, performed surprisingly well. Photoperiod responses were accounted for indirectly by adjusting the GDD₁₂ sum for each latitude.

The sensitivity analyses in this study revealed some interesting responses to temperature and rainfall. Changes in temperature caused different simulated yields in these northern, often temperature-limited, locations. Two conflicting processes may explain some of the results. As temperatures increase, plants may increase water use, leading to more drastic drought limitations to grass yield. When temperatures decrease sufficiently, in such northerly locations, shortened growing seasons can reduce grass yields. Likewise, increased rainfall also leads to two different competing processes affecting grass yields. While increased rainfall decreases drought stress, it also results in more nitrogen loss through leaching and in the runoff, so increased nitrogen deficiency.

Future work with this model should involve parameter derivation for the most common individual switchgrass populations and parameter derivation and model validation with other biofuel species such as *Miscanthus* (*Miscanthus* x *giganteus*) [3]. The ability of the model to simulate diverse species with a common framework of soils and weather make it an invaluable tool as other plant species are considered for biofuel production.

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