Supporting Information

Economic and Sustainability impacts of yield and composition variation in bioenergy crops: *Panicum virgatum L.*

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Supporting information contains nine tables and seven figures over fourteen pages with 12 additional references.

Switchgrass Yield and Cost

[Figure S1](#page-1-0) shows the results of the feedstock cost model as a function of commercial-scale switchgrass yield, for a fixed annual biorefinery demand and density of fields in switchgrass production. The components of total delivered switchgrass costs include marginal land rental, planting, annual land maintenance, harvest, transport, storage, and grinding. Harvest, transport, and land maintenance costs decrease the most as the switchgrass yield increases from 5 to 17 Mg ha⁻¹. An increase in yield reduces the land requirement which affects the harvest and land maintenance cost while the reduced supply shed footprint affects the transport cost. However, total costs become much less sensitive to yield above 18 Mg ha⁻¹, with the rate of change in total cost per megagram when increasing the yield by 1 megagram per hectare is less than two percent. It should be noted that this is not the price that a biorefinery would pay for feedstock at the refinery gate, but rather is a techno-economic cost that would be incurred if the refinery managed the feedstock supply chain up to the beginning of the conversion processes or the first "reactor throat" or the beginning of the conversion processing. We can assume that if the refinery was purchasing the feedstock from local growers, then the purchase cost would be based on the incurred cost plus a factor for grower profit.

Figure S1. Feedstock delivered costs (\$ per dry Mg) as a function of switchgrass yield.

Composition

Table S1. Percent Composition Statistics for 331 analyzed switchgrass samples selected from the population (% w/w)

** Lignin and syringyl/guaiacyl ratio (S/G) were not determined via models but predicted relative to standard response, hence no model error reported, see Decker et* al., 2018 for analysis details¹.

Key Numerical Results for Figures 6, 7, 8, 9 and S6.

Table S2. Life cycle GWP, CED, and AWARE results for all variants, alongside the fermentable carbohydrate mass fraction, on-farm yield, and MFSP values.

Statistical Summary of Numerical Results

Table S3. Statistical summary of ethanol life cycle impacts observed in this study.

Inventory Comparison to Other Studies

Table S4. Agricultural inputs comparison between GREET (2021)², and this study, adapted from Supplementary Table 8 of Field et al (2018)³. Where values are given as ranges, the exact values used for a variant were dependent on the estimated switchgrass yield projected from the single plant yields. While the units here are reported in metric or English units as in the cited studies, all were converted in SI for the calculations.

Table S5. Biorefinery inputs and coproduct comparison between GREET (2021)² and this study. Where values are given as ranges, the exact values used for a variant were dependent on switchgrass composition.

Process Contribution Analysis

A process contribution analysis (PCA) provides more detailed insight into environmental hotspots, which are processes involved in ethanol production which may be producing a disproportionate level of impacts. This analysis can be a first step towards identifying and prioritizing research areas that could reduce total life cycle impacts. For this study, the objective of the PCA is to identify any trends that may exist in process-specific impacts due to variability in FCMF or in switchgrass yield. Variants were selected for PCA based on five percentiles of the FCMF values and of the yield values represented in the study. After calculating the FMCF percentiles, the five variants with FCMF values closes to those percentiles were selected for PCA, and five variants representing the switchgrass yield percentiles were chosen analogously. Figure S2 shows box-and-whisker plots of the five percentiles for FCMF (A) and for yield (B), with percentiles labeled with the corresponding variant names in gray.

Figure S2. Box-and-whisker plots showing (A) five fermentable carbohydrate mass fraction percentiles and (B) five switchgrass yield percentiles, with the switchgrass variants nearest to each percentile labeled in gray. The process contribution analysis was performed on these ten variants.

The ethanol life cycle was divided into five process categories for the PCA. Four of these categories cover switchgrass agriculture and logistics: site preparation and planting, chemicals and application operations, harvest operations, and transport to biorefinery. The final category consists of inputs to the biorefinery.

PCA results are shown in Figures S3, S4, and S5 for GWP, CED, and the AWARE indicator, respectively. Numerical PCA results are listed in Tables S6 and S7. In each PCA figure, results for the FCMF percentile variants are given in sub-figure (A) and the yield percentile variants are in sub-figure (B). A lighter shade indicates a higher percentile. For all three impacts, increased FCMF does not correspond to a uniformly increased or decreased impact in any of the five process categories, while increased yield does correspond to decreased impacts for all categories except site preparation and planting.

Figure S3. Global warming potential for 1 L ethanol disaggregated by process category and shown for selected variants based on carbohydrate fraction percentiles (A) and yield percentiles (B).

Figure S4. Cumulative energy demand for 1 L ethanol disaggregated by process category and shown for selected variants based on carbohydrate fraction (A) and yield percentiles (B).

Figure S5. Available water remaining indicator for 1 L ethanol disaggregated by process category and shown for selected variants based on carbohydrate fraction (A) and yield percentiles (B).

Figure S6. Ethanol cumulative energy demand (MJ/L) shows a strong negative correlation (R^2 = 0.77) with switchgrass yield.

Figure S7: MFSP decreases with increasing fermentable carbohydrate content. $(R^2 = 0.70)$ when considering only the higher yielding switchgrass genotypes (≥ 20 dry Mg/ha)

Table S6. Process contribution analysis results for the fermentable carbohydrate mass fraction percentile variants.

Table S7. Process contribution analysis results for the switchgrass yield percentile variants.

Feedstock Supply Model Details

Our switchgrass transport process included crews of semi-trucks with flatbed trailers moving the bales to storage near the refinery with loaders at both the field and the storage facility. The storage near the refinery consisted of a hybrid storage process with half of the feedstock stored under a tarp on a gravel pad and the other half stored covered under a pole barn. The tarped feedstock would be used first so weather during storage would have minimal effect on the stored feedstock. The system would only keep a few days' supply of feedstock at the refinery where it is processed by a grinder.

Table S8. Feedstock cost model parameters. While the units here are reported in metric or English units as in the cited studies, all were converted in SI for the calculations.

^a Using a 235 hp mower conditioner (JD W235M) with a list price of \$184,457

b Using a large square baler (JD L341) with a list price of \$198,583 pulled by a 190 hp tractor (JD 6R 195) with a list price of \$247,674.

^c as suggested by FDC Enterprises.

^d Assuming a purchase cost of \$202,500 for a 320 hp Stinger Stacker 6500.

 \textdegree Assuming a bale density of 175 dry Kg per m³ and a moisture of 15%.

^f Assuming a purchase cost of \$109,835 for a semi-truck, \$49,410 for a flatbed trailer (53 ft. X 102 in.), and \$85,112 for a wheeled loader (JD 204L Wheeled Loader).

^g Using one loader at the field for each transport crew consisting of three to four semi-trucks with flatbed trailers.

The number of fields required was calculated for each yield scenario using the annual refinery demand of 2000 dry U.S. tons while assuming a 3% dry matter loss (DML) during storage (3), a field size of 60 hectares, and the switchgrass yield set by the scenario which ranged from 5 to 40 Mg ha⁻¹. We assumed a switchgrass supply shed density of 15% which would randomly place one 60-hectare field every four km². The road distance from the refinery to the field was assumed to be a factor of 1.4 times the direct distance.

Table S9. Feedstock cost model parameters

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