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Sustainable Triacetic Acid Lactone Production from Sugarcane by

- Fermentation and Crystallization
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24 Abstract

There is a pressing need to replace crude oil with renewable feedstocks such as sugarcane to 25 manufacture fuels and chemicals. Triacetic acid lactone (TAL) is a bioproduct of particular interest 26 as a platform chemical with the potential to produce commercially important chemicals including 27 sorbic acid and polydiketoenamine plastics. In this study, we leveraged BioSTEAM-an open-28 source platform-to design, simulate, and evaluate under uncertainty (via techno-economic 29 analysis, TEA, and life cycle assessment, LCA) biorefineries producing TAL from sugarcane by 30 31 microbial conversion of sugars. We experimentally characterized TAL solubility, calibrated solubility models, and designed a process to separate TAL from fermentation broths by 32 crystallization. The biorefinery could produce TAL (≥94.0 dry-wt%) at a minimum product selling 33 price (MPSP) of \$4.87 kg⁻¹ (baseline) with a range of \$4.03–6.08 kg⁻¹ (5th–95th percentiles). The 34 MPSP was below the maximum viable TAL price range for sorbic acid production (\$5.99-7.74 kg⁻ 35 ¹) in ≥93% of simulations and consistently below the benchmark price to produce 36 polydiketoenamines (\$10·kg⁻¹). We used a quantitative sustainable design framework to explore 37 the theoretical fermentation space (titer, yield, and productivity combinations), potential 38 separation improvements (mitigating TAL ring-opening decarboxylation through pH control), and 39 operation scheduling and capacity expansion strategies (e.g., through integrated sweet sorghum 40 processing). Advancements in key design and technological parameters could greatly improve 41 the biorefinery's financial viability (MPSP of \$2.60 kg⁻¹ [\$2.31-3.16 kg⁻¹], consistently below the 42 maximum viable price range for sorbic acid and polydiketoenamines production) and 43 environmental benefits (carbon intensity of 3.65 [1.90-5.43] kg CO₂-eq·kg⁻¹, with net 44 displacement of fossil energy consumption in 70% of simulations). This research highlights the 45 46 ability of agile TEA-LCA to screen promising designs, navigate sustainability tradeoffs, prioritize research needs, and chart quantitative roadmaps for the continued development of bioproducts 47 and biofuels. 48

49 Introduction

Triacetic acid lactone (TAL) has been identified as a bio-privileged chemical-a bio-derived 50 chemical intermediate that can be converted into a diverse set of useful chemical products.¹⁻⁵ 51 This utility has motivated recent efforts to investigate the potential use of TAL as a platform 52 chemical in the production of commercially important commodity chemicals (e.g., sorbic acid and 53 potassium sorbate,^{2,6} acetylacetone²), specialty chemicals (e.g., pogostone,⁷ katsumadain,⁸ 54 penicipyrone⁹), and novel chemicals with the ability to serve as functional replacements to existing 55 products (e.g., highly recyclable and thermally stable polydiketoenamine plastics,¹⁰ enhanced 56 corrosion inhibitors in steel equipment³). In 2019, an estimated 72,350 metric tons of sorbic acid 57 (with a market value of \$480 million) was consumed globally, and this demand is projected to 58 grow at 3.8% annually from 2020–2030 (to approximately 104,000 metric ton y⁻¹, with a market 59 value of \$770 million) largely due to its increasing usage as a preservative in the food and 60 beverage industry.¹¹ A more recent report actually estimated a global sorbic acid market of 61 150,000 metric tons in 2023 and projected a 4.8% annual growth to 260,000 metric ton v^{-1} by 62 2034.¹² 63

Currently, both TAL and sorbic acid are produced almost exclusively via chemical 64 synthesis.^{5,11,13} Sorbic acid is primarily produced via the condensation of malonic acid and 65 crotonaldehyde,^{4,13} which are both primarily fossil-derived chemicals.^{14–16} Alternatively, sorbic 66 acid can be produced from TAL through a series of reactions (namely hydrogenation, dehydration, 67 ring-opening, and hydrolysis) with high overall yields (e.g., approximately 77% as potassium 68 sorbate).^{2,6} TAL does not currently have an established global market as the chemical synthesis 69 route is prohibitively expensive.⁵ However, the prospects for the biological production of TAL 70 71 continue to improve, with recent advancements in the conversion of sugars and acetate by metabolically engineered strains of microbes including Saccharomyces cerevisiae,¹⁷⁻²¹ Yarrowia 72 lipolytica,^{7,22-25} Escherichia coli,^{10,20,26} and Rhodotorula toruloides²⁷ (formerly classified as 73

*Rhodosporidium toruloides*²⁸). By integrating the biological production of TAL with catalytic
 upgrading to sorbic acid, we have the potential to produce bio-derived sorbic acid with greater
 financial viability and environmental benefits than conventional, fossil-derived production.

To achieve biological production of TAL at the industrial scale, key challenges related to 77 78 fermentation and separation of TAL from the fermentation broth need to be addressed. In particular, the poor performance of fermentation microbes results in high costs associated with 79 feedstock acquisition (due to low yield) and product separation (due to low titer).^{10,29} To overcome 80 low titers, a recently proposed separation process leveraged activated carbon for adsorption of 81 TAL from the fermentation broth with 72% recovery, but this process may be undermined by 82 biologically derived impurities in the product stream due to non-selective adsorption.²⁹ 83 Crystallization has been suggested as an alternative method for low-cost separation of TAL.¹⁰ 84 However, the high cell density associated with TAL production (e.g., up to 47 g cell mass L⁻¹ 85 broth²⁵) coupled with the low solubility of TAL in water at fermentation operating temperatures 86 (e.g., 8.41 g·L⁻¹ at 30°C;³⁰ the temperature maintained for TAL production by Y. *lipolytica* is 28– 87 30°C^{7,22-25}) poses difficulties for selective TAL recovery by crystallization. If insoluble solids (cell 88 mass and crystallized TAL) were directly centrifuged out of the broth, it may be difficult to obtain 89 a pure TAL stream free of cellular debris (e.g., solvent extraction may cause cell lysis by organic 90 solvents and mechanical disruption), resulting in potentially costly downstream separation and 91 purification of TAL. Although it may be possible to separate TAL from fermentation broths through 92 crystallization more effectively, design and simulation of such processes has been limited due to 93 94 the lack of data and models for TAL solubility in water at relevant temperatures.

Further, despite the potential of bio-based TAL as a platform chemical for sustainable biomanufacturing, we are only aware of three studies that characterized its financial viability (via techno-economic analysis, TEA)^{10,29,31} and one study that characterized its life cycle environmental impacts (via life cycle assessment, LCA)¹⁰. In these previous studies, a lack of available data and validated solubility models often (understandably) required authors to make

simplifying assumptions. These necessary assumptions included neglecting the low solubility of 100 101 TAL in aqueous solutions (e.g., by modeling high-titer fermentation broths and assuming TAL was completely dissolved),³¹ assuming a stable supply of sugar as the feedstock (without considering 102 the recovery of sugars from biomass feedstocks and the impact of feedstock harvest schedules 103 on biorefinery annual operating days),²⁹ and assuming co-utilization of glucose and xylose based 104 on fermentation performance observed in experimental work solely using glucose.¹⁰ Additionally, 105 studies have often used single or discrete sets of assumptions without characterizing the 106 uncertainty in results or evaluating the implications of technological advancements on the financial 107 viability and environmental sustainability of proposed processes.^{10,29,31} Ultimately, prioritizing 108 research and development for bio-based TAL production would benefit from consideration of the 109 end-to-end process with robust modeling of key physical and chemical properties under 110 uncertainty and by evaluating the system sustainability implications of further technological 111 improvements beyond the current state-of-technology. 112

The objectives of this study were to evaluate the potential for sustainable production of 113 TAL from renewable, sugar-based feedstocks across a landscape of technology performance 114 scenarios, and guide future research and development pathways to advance bio-based TAL 115 production. To this end, we leveraged BioSTEAM,^{32,33} an open-source platform in Python, to 116 assess the potential for the financially viable and environmentally sustainable production of TAL. 117 First, we experimentally characterized TAL solubility in water at temperatures ranging from 0°C 118 to 93°C and for the ring-opening decarboxylation of TAL in water to acetylacetone (Figure 1). 119 Next, we fit thermodynamic solubility models to the obtained TAL solubility data and, using the 120 calibrated solubility model, we designed a process to separate TAL from fermentation broths by 121 crystallization. We developed a full biorefinery design to produce TAL from sugarcane and sweet 122 sorghum and analyzed a baseline scenario with the microbial strain Yarrowia lipolytica using 123 demonstrated fermentation performance from the literature.²² We then performed Monte Carlo 124 simulations to characterize the uncertainty in sustainability indicators (minimum product selling 125

price, MPSP; life cycle carbon intensity, CI; fossil energy consumption, FEC) and sensitivity 126 analyses to identify key technological drivers. To better understand the economic and 127 environmental implications of potential process improvements, we designed and simulated 128 biorefineries across the entire theoretical fermentation space (i.e., across all possible titer, yield, 129 130 and productivity combinations) and under potential improvements in separation (i.e., decreased ring-opening decarboxylation of TAL by pH control to improve recovery). In addition, we explored 131 the economic implications of alternative biorefinery operating schedules (including the integration 132 of sweet sorghum as an additional feedstock) and TAL production capacities. Finally, we discuss 133 and prioritize research and development opportunities along the value chain to advance the 134 financial viability and environmental sustainability of bio-based TAL production. 135



Figure 1. Overview of key reactions discussed in this work. Chemical structures are depicted immediately below the names of the compounds they represent. Numbers at beginnings and ends of arrows denote stoichiometric coefficients of reactants and products, respectively. Theoretical maximum yields by mass

(theoretical max. yield) are shown for each reaction. Although citric acid may be used by Y. lipolytica for 140 141 TAL production in the absence of glucose, this is not depicted because TAL production was modeled solely from sucrose, glucose, and xylose. Citric acid production from glucose was modeled based on the final 142 yield after citric acid depletion for TAL production reported by Markham et al.²² Reaction intermediates are 143 omitted for clarity. In the case of catalytic conversion of TAL to sorbic acid, intermediates (serially: 5,6-144 dihydro-4-hydroxy-6-methyl-2H-pyran-2-one; 4-hydroxy-6-methyltetrahydro-2-pyrone; and parasorbic acid) 145 can occur in a series of reactors (e.g., for hydrogenation, dehydration and ring-opening, and hydrolysis, 146 respectively).^{2,6} In the case of catalytic conversion of TAL to polydiketoenamine plastics, aliphatic 147 148 dicarboxylic acids can be used along with TAL (stoichiometric coefficient n will depend on the structure of 149 the targeted resin) to make bio-based monomers, which can be milled with amine monomers (1:1 stoichiometry with TAL) to make polydiketoenamine resins (chemical structures are not depicted for clarity, 150 and theoretical maximum yields will depend on the aliphatic dicarboxylic acids used).¹⁰ 151

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153 Methods

154 System Description

155 *Estimating the Market Opportunity*

Although TAL can be catalytically upgraded to a diverse set of specialty, commodity, and novel 156 chemicals, it does not yet have an established global market. A TAL market price of \$10 kg⁻¹ has 157 been previously suggested based on the potential for TAL to serve as a direct replacement for 158 the petrochemical dimedone¹⁰ to synthesize polydiketoenamines—highly recyclable plastics.^{34,35} 159 A recent study demonstrated that bio-based TAL can be used to produce polydiketoenamine 160 161 plastics with greater thermal stability and a wider range of serviceable applications than the petrochemical dimedone.¹⁰ The estimated global demand for bio-based plastics was 162 approximately 1.05 million metric tons in 2023 and could grow 9.3% annually to 1.63 million metric 163 tons by 2028,³⁶ indicating a large market opportunity. As an alternative benchmark, TAL could 164 serve as a feedstock for sorbic acid production. TAL can be upgraded to sorbic acid through a 165

series of reactions (hydrogenation, dehydration, ring-opening, and hydrolysis) with a theoretical 166 maximum yield of 0.889 g sorbic acid g TAL⁻¹. Sorbic acid is a commodity chemical with one 167 report estimating a global demand of 72,350 metric tons in 2019 (expected to grow at 3.8% 168 annually from 2020 to 2030).¹¹ A more recent report actually estimated the 2023 global sorbic 169 acid market was 150,000 metric tons and could grow 4.8% annually to 260,000 metric ton y^{-1} by 170 2034.¹² Due to its antimicrobial properties, sorbic acid is mainly used as a preservative in foods 171 and beverages, pharmaceuticals, and animal feed.¹¹ It is also used as a preservative in cosmetics, 172 biomanufacturing processes, and in formulations for soaps and detergents.¹¹ The U.S. ranks first 173 globally in sorbic acid consumption (about 23,800 metric tons in 2019) and produces roughly 50% 174 of this amount, also relying on imports to satisfy the demand.¹¹ The 2019 market price of sorbic 175 acid was \$6.74 kg⁻¹ in the U.S, and a 2023 search for vendor listings on Alibaba (with the "verified" 176 and "trade assurance" filters active) of bulk sorbic acid orders showed a lowest selling price listed 177 as potassium sorbate at \$6.50 kg⁻¹ potassium sorbate (equivalent to \$8.71 kg⁻¹ sorbic acid 178 assuming 100% conversion).^{11,37} Based on the theoretical maximum yield of sorbic acid from TAL, 179 it follows that the TAL price must be below \$5.99-7.74 kg⁻¹ to have any potential for market-180 competitive sorbic acid production. This price range neglects costs associated with TAL 181 182 conversion to sorbic acid, but also neglects potential financial incentives for bio-derived products (e.g., government incentives,³⁸ consumers' willingness to pay higher prices³⁹). Thus, to inform the 183 discussion of TAL financial viability in this work, we benchmarked TAL MPSP results against the 184 range of \$5.99–7.74 kg⁻¹ (for TAL as a feedstock to produce sorbic acid) and the aforementioned 185 literature value of \$10 kg⁻¹ (for TAL to replace dimedone as a feedstock to produce 186 polydiketoenamine plastics¹⁰). 187

188 Juicing, Fermentation, and Separation Processes

The biorefineries in this study are comprised of three main (inside battery limits) processes (feedstock juicing and clarification, fermentation, and separation) with outside-battery wastewater 191 treatment and miscellaneous facilities (a biorefinery overview is provided in Figure S1, and a detailed list of biorefinery equipment is provided in **Table S2** in the Electronic Supplementary 192 Information, **ESI**). The biorefinery's production capacity was 13,385 metric ton TAL·y⁻¹ in the 193 baseline case, which would be enough to produce 11,900 metric tons of sorbic acid annually 194 195 assuming theoretical maximum conversion. This production capacity was chosen based on (i) the growth projected in the annual U.S. demand for sorbic acid between 2020-2030 (from 196 approximately 23,800 metric tons of sorbic acid in 2019 to a projected 34,550 metric tons of sorbic 197 acid in 2030) and (ii) the amount by which the 2019 U.S. consumption of sorbic acid (23,800 198 metric tons) exceeded the 2019 U.S. production capacity (12,375 metric ton y⁻¹).¹¹ This translates 199 to a baseline biorefinery accepting 620,540 metric ton y^{-1} sugarcane, which is well within the 200 reported annual capacity for an intermediate-size sugarcane processing facility (1,600,000 metric 201 tons⁴⁰) that has been assumed in previous sugarcane biorefinery TEAs.^{41–43} Larger production 202 capacities were also explored to improve financial viability. The biorefinery was assumed to 203 operate 180 days annually in the baseline case, an operating time previously estimated for 204 sugarcane biorefineries in the southern U.S. based on typical harvest periods and maximum 205 storage times.^{41–43} Assumptions related to feedstock composition (**Table S1**), as well as baseline 206 207 values and distributions for all parameters included in the uncertainty analysis (Table S6), are detailed in the ESI. The process models used for sugarcane juicing and clarification are described 208 in previous studies.33,41 209

The bagasse from crushing feed sugarcane is diverted to the boiler for combustion and the clarified juice is sent to the fermentation process. In the fermentation process, the juice undergoes a two-part scheme involving multiple-effect evaporation followed by dilution as needed to achieve the necessary concentration of sugars (**Figure 2A**). The sequentially evaporated and diluted juice is sent to fermentation with *Y. lipolytica*. Note that, to be consistent with chemical engineering literature, the term *fermentation* is used here to mean microbial conversion (including aerobic conversion) of a substrate to a specific product in a bioreactor. Sodium acetate is also

217 fed into the fermentation reactor as an additional carbon source for TAL production (baseline values and ranges for sodium acetate loading and all other parameters included in the uncertainty 218 analysis are listed in Table S6 in the ESI). In addition, corn steep liquor and diammonium 219 phosphate were also added to the fermentation broth to satisfy microbial nitrogen and phosphorus 220 221 requirements, respectively (further explained in Section S1.1 in the ESI). Based on data from the literature, the baseline fermentation performance was assumed to achieve an overall TAL yield 222 of 40.5% of the theoretical maximum yield on glucose and acetate (the values of the theoretical 223 maximum yields on glucose and acetate being approximately equal at 0.467 g-TAL·g-glucose 224 eq.⁻¹ and 0.467 g-TAL·g-acetic acid eq.⁻¹, respectively²²), a maximum titer of 35.9 g·L⁻¹, and a 225 productivity of 0.12 g·L⁻¹·h⁻¹ (reasoning provided in Section S1.1 and Table S3 in the ESI) Some 226 glucose was assumed to be converted to citric acid with a yield of 0.094 g g⁻¹ based on the 227 reported concentrations in the fermentation media and broth.²² Aeration was modeled based on 228 the dissolved oxygen saturation of 50% reported to be maintained²² (detailed process description 229 provided in Section S1.1 in the ESI; baseline values and ranges for citric acid yield, aeration rate, 230 and all other parameters included in the uncertainty analysis are listed in **Table S6** in the **ESI**). 231



Figure 2. Simplified block flow diagram for the (A) fermentation and (B) separation processes. WWT denotes wastewater treatment. Some units (e.g., pumps, mixers, splitters, heat exchangers) are not included in the figure for clarity; the process flow diagram in the system report (available in the online repository⁴⁴) includes the full set of details.

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After fermentation, the produced broth containing TAL, insoluble cellular materials, and other impurities is directed to the separation process. The design of this separation process was enabled by the experimentally calibrated temperature-dependent solubility model for TAL (discussed in *Results and Discussion*). First, the broth is heated to a sufficiently high temperature to dissolve all TAL present (step 1 in **Figure 2B**), after which insoluble cellular materials are centrifuged out (step 2 in **Figure 2B**) and the liquid effluent is sent to crystallization at 1°C (step 3 in **Figure 2B**). A second centrifugation unit (step 4 in **Figure 2B**) separates the supernatant,

which is diverted to wastewater treatment, from the crystallized TAL, which is dried (step 5 in 246 Figure 2B) and sent to storage. Based on experimental observations while heating TAL in water 247 (Section S1.2 in the ESI), we modeled ring-opening decarboxylation of TAL to 2,4-pentanedione 248 (acetylacetone), which was assumed to remain in the liquid supernatant due to its low melting 249 point (-23°C⁴⁵) and high solubility in water (e.g., 160 g L^{-1} at 25°C⁴⁵). Evaporation of water from 250 the broth before crystallization was not considered as heating TAL in aqueous solutions can result 251 in TAL loss by ring-opening decarboxylation.^{2,46} In addition to the baseline separation process, 252 we also explored the possibility of mitigating ring-opening decarboxylation of TAL through pH 253 control by simulating adding purchased sodium hydroxide prior to heating (step 1; Figure 2B). 254

255 Thermodynamic Modeling of TAL Solubility in Water as a Function of Temperature

TAL solubility in water was experimentally measured at temperatures ranging from 0°C-93°C 256 (Section S1.2 in the ESI). Further, we observed ring-opening decarboxylation of the dissolved 257 TAL to 2,4-pentanedione (acetylacetone) to occur when heating the solution-a phenomenon 258 previously reported in the literature^{2,46}—and we specifically measured the TAL ring-opening 259 decarboxylation conversion at temperatures ranging from 30°C-80°C (Section S1.2 in the ESI). 260 In a binary system, assuming the solid phase is pure, at temperature T (in K), the solubility 261 x_2 (as a mole fraction; e.g., mol-TAL·mol-solution⁻¹) of a solid solute may be expressed as follows 262 (from Equation 8.16.3 in 4^{7}): 263

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$$\ln \gamma_2 x_2 = \frac{-\Delta H_m}{RT} (1 - \frac{T}{T_m})$$
(Equation I)

where γ_2 is the activity coefficient of the solute, ΔH_m is the enthalpy change for melting the solute at the triple-point temperature, T_m is the normal melting temperature (in K), and *R* is the molar gas constant (8.3145 J·mol⁻¹·K⁻¹).

The activity coefficient (γ_2) of the solute may be expressed using a one-parameter van Laar equation as follows (applying the parameter reduction method suggested by Poling, Prausnitz, and O'Connell⁴⁷ to the equation originally proposed by Wohl⁴⁸):

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$$\ln \gamma_2 = \frac{A}{RT} \left(1 + \frac{V_2^L}{V_1^L} \frac{x_2}{(1-x_2)} \right)^{-2}$$

where V_1^L and V_2^L are the liquid molar volumes of the solvent and solute, respectively, and *A* is an empirical constant.

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From **Equations (I)** and **(II)**, we obtain:

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$$x_2 = e^{\frac{-\Delta H_m}{RT} \left(1 - \frac{T}{T_m}\right) - \frac{A}{RT} \left(1 + \frac{V_2^L x_2}{V_1^L (1 - x_2)}\right)^{-2}}$$
 (Equation III)

which is an implicit equation that may be used to numerically solve for x_2 at a given value of *T*. Although other equations were evaluated and fit to the experimental data (additional details presented in **Section S1.3** in the **ESI**), **Equation (III)** was exclusively used to estimate TAL solubility for all simulations in this work because of the high goodness of fit obtained for 12 experimental data points using one empirical constant, *A* (further detailed in *Results and Discussion*).

282 Facilities

Facilities in the biorefinery include a boiler (for on-site heat utility production), turbogenerator (for 283 on-site electricity production), a cooling tower and chilled water system (for on-site cooling utility 284 285 production), wastewater treatment (using a newly developed high-rate process scheme that includes internal circulation reactors and anaerobic membrane bioreactors for biogas 286 production⁴⁹), heat exchanger network (HXN, for heat integration to minimize heating and cooling 287 utility demands), process water center (for water reuse), and other auxiliary units for storage, air 288 289 distribution, and clean-in-place. These facilities were modeled to be consistent with previous studies (additional details presented in Section S1.5 in the ESI).50-52 290

291 Open-Source System Model

The biorefinery was designed, simulated, and evaluated using BioSTEAM,^{32,53} and the thermodynamic package utilized was Thermosteam.^{54,55} Briefly, influent and effluent streams of each unit are simulated in BioSTEAM and coupled with operating parameters and equipment cost algorithms for unit design and cost calculations. Further descriptions of major processes and units
(Section S1, Table S2) as well as baseline values and uncertainty distributions of key parameters
(Table S6) are included in the ESI. All Python scripts for BioSTEAM and the biorefinery (including
biorefinery setup and system analyses) as well as a system report (including detailed process
flowsheet, stream composition and cost tables, unit design specifications, and utilities for the
baseline simulation) are available in the online repository.⁴⁴

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302 System Analyses under Uncertainty

303 Techno-Economic Analysis (TEA)

We performed TEA for the designed and simulated biorefineries using BioSTEAM's discounted 304 cash flow rate of return analysis to calculate the minimum product selling price (MPSP, \$.kg⁻¹) of 305 306 TAL to achieve a net present value of zero with a 10% annual internal rate of return (a uniform distribution of 8-12% was assumed based on values proposed in previous sugarcane biorefinery 307 TEAs;^{41–43} a full list of baseline parameter values, uncertainty distributions, and literature 308 references for the same are provided in **Table S6** in the **ESI**). The biorefinery was modeled as an 309 nth plant design (i.e., it is assumed a successful industry has been established with mature 310 technologies). Key construction (e.g., warehouse, site development), fixed operating (e.g., labor 311 burden, property insurance), and financial (e.g., depreciation, taxes) parameters followed 312 assumptions in previous studies^{56,57} and are included in the Python script.⁴⁴ All costs and prices 313 shown are presented in 2019 U.S. dollars. All parameters used in the cash flow analysis follow 314 the assumptions made by Humbird et al.⁵⁶ except for the baseline federal corporate tax rate, which 315 was updated to 21% (the current rate as of 2017⁵⁸). To account for several potential changes, ^{59,60} 316 the uncertainty analysis assumes the federal corporate tax may vary uniformly between 15-28% 317 318 (a full list of baseline values, uncertainty distributions, and literature references for all 30 parameters included in the uncertainty analysis are provided in Table S6 in the ESI). A breakdown 319

of the estimated revenue and capital and operating expenditures, as well as additional details on the design, utility requirements, purchase costs, and installed equipment costs can be found online.⁴⁴

323 Life Cycle Assessment (LCA)

We performed LCA in Python using the simulated inventories for streams (input chemicals and 324 325 output emissions) and utilities from BioSTEAM. The LCA scope included the operational phase of the biorefinery, including cradle-to-grave impacts for all raw materials, ancillary processes, and 326 unit processes. The functional unit was set to 1 kg of produced TAL to be consistent with the TEA. 327 The sale of co-produced electricity was assumed to displace the impacts of marginal electricity 328 329 production. Impacts resulting from infrastructure construction were excluded to be consistent with the U.S. renewable fuel standard (RFS).⁶¹ Final characterization and discussion of environmental 330 impacts focused on two impact categories—carbon intensity (CI; guantified as 100-year global 331 warming potential, GWP₁₀₀) and fossil energy consumption (FEC)—which were selected to enable 332 comparisons with results from the literature and based on their relevance to policies and 333 legislation.^{62,63} The impact assessment methodology used for CI was the Intergovernmental Panel 334 on Climate Change (IPCC) 2013,⁶⁴ and that used for FEC was the Tool for the Reduction and 335 Assessment of Chemical and other Environmental Impacts (TRACI) 2.0.65 Life cycle inventory 336 data were collected from ecoinvent 3.8 and some unit impacts were gathered from GREET 337 2020,^{66,67} and their sources were noted in the script.⁴⁴ The baseline impacts of feedstock farming 338 (excluding credit for fixed carbon), harvest and collection, transportation, storage, and handling 339 were considered (Table S6). The amount of carbon fixed in the feedstock is equal to the sum of 340 341 carbon in the product (TAL) and in the biogenic portion of direct waste emissions from the biorefinery. To focus on the biorefinery, we assumed the end-of-life impacts associated with the 342 product (TAL) as well as non-gaseous wastes (e.g., unconsumed and non-combusted sugars and 343

insoluble lignin in the brine, accounting for <0.05% of the CI) would be exclusively from passive
 oxidation of all carbon into CO₂.

346 Uncertainty and Sensitivity Analyses

Uncertainty analysis was conducted for the baseline biorefinery design using Monte Carlo 347 simulation with Latin Hypercube Sampling (6,000 simulations) for 30 uncertain parameters. The 348 349 full list of the evaluated parameters, their uncertainty distributions, and literature references are provided in Table S6 (ESI). We assigned uniform distributions for parameters for which literature 350 values were lacking and triangular distributions for parameters with strong literature support for 351 most probable values and ranges (detailed description on the choice of distribution type and range 352 353 is included in Section S1.6 of the ESI). The sensitivity of MPSP, CI, and FEC to all uncertain inputs was determined via Spearman's rank order correlation coefficients (Spearman's ρ) using 354 Monte Carlo simulation results, and parameters to which the sustainability indicators (MPSP, CI, 355 FEC) were most sensitive (i.e., |Spearman's ρ | \geq 0.10 and ρ -value < 0.05) were identified for 356 additional analyses. In addition, the improvements in sustainability indicators in response to 357 technological advancements in fermentation and separation were also characterized. For 358 fermentation, indicator sensitivity to fermentation titer (i.e., the final TAL concentration in the 359 fermentation reactor in g·L⁻¹), overall yield (i.e., the mass of TAL produced per unit mass of sugars 360 361 and acetate consumed; the theoretical maximum or 100% of theoretical yields are approximately 0.467 g-TAL·g-glucose eq.⁻¹ and 0.467 g-TAL·g-acetic acid eq.⁻¹), and productivity (the mean rate 362 of TAL production in $g \cdot L^{-1} \cdot h^{-1}$) were quantified. For separation, indicator sensitivity to TAL ring-363 opening decarboxylation (mol%; 20.9% in the baseline case) and pH maintained (by addition of 364 365 sodium hydroxide; pH was 2.10 in the baseline case due to the presence of acids-namely, phosphoric acid added during feedstock pretreatment and citric acid produced during 366 fermentation) were quantified. Finally, we quantified indicator sensitivities to biorefinery annual 367

operating time (days) and TAL production capacity (metric ton y^{-1}). Files with comprehensive results of all analyses are available online.⁴⁴

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Results and Discussion

372 Temperature-Sensitive Solubility of TAL in Water

By experimentally measuring TAL solubility in water at various temperatures (**Table S4** in the **ESI**), we identified TAL solubility in water was highly sensitive to temperature, with a minimum observed value of $3.52 \text{ g-TAL}\cdot\text{L}^{-1}$ at 0°C and a maximum observed value of $130.65 \text{ g-TAL}\cdot\text{L}^{-1}$ at 93°C. This disparity demonstrated the potential for a separation process design that exploits the temperature-sensitivity of TAL solubility.

The enthalpy change of fusion ΔH_m of TAL at the triple-point temperature was estimated to be 30883.7 J·mol⁻¹ using the Dannenfelser-Yalkowsky method.^{47,68} For the melting temperature T_m of TAL, a reported experimental value of 458.15 K was used.⁶⁹ For the liquid molar volume of water V_1^L , a reported experimental value of 1.801 *10⁻⁵ m³·mol⁻¹ was used.⁷⁰ The liquid molar volume of TAL V_2^L was estimated to be 8.85 *10⁻⁵ m³·mol⁻¹ using the Fedors method.⁷¹

The empirical constant A was estimated for **Equation (III)** by using the experimental 383 values obtained in this work for TAL solubility in water at various temperatures and maximizing 384 the coefficient of determination, R^2 . This resulted in a value of 7029.6 J·mol⁻¹ for A in Equation 385 (III), with R² maximized to a value of 0.992 (Figure 3). This Equation (III) was exclusively used 386 to estimate TAL solubility in water for all simulations in this work as it was associated with a higher 387 R² (0.992) when fit to the experimental TAL solubility data in this work compared with other 388 solubility models (implicit and explicit equations using the one-parameter Margules equation for 389 the activity γ_2 resulted in R² values of 0.988 and 0.983, respectively; further detailed in **Section** 390 S1.3 and Figure S3 of the ESI). 391



Figure 3. Solubility of TAL in water (g-TAL·L⁻¹; *y*-axis) as a function of temperature (°C; *x*-axis). The solubility model with activity coefficients estimated by the one-parameter van Laar method (applying the parameter reduction method suggested by Poling, Prausnitz, and O'Connell⁴⁷ to the equation originally proposed by Wohl⁴⁸) as shown in Equation (III) is plotted (solid black line) along with experimentally observed solubilities used to fit the model (blue cross markers).

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400 Financial Viability under Uncertainty

The MPSP of TAL was estimated to be \$4.87 kg⁻¹ (baseline) with a range of \$4.03-6.08 kg⁻¹ 401 [5th-95th percentiles, hereafter shown in brackets]. Overall, for the current state-of-technology 402 under uncertainty and considering TAL to be a feedstock for sorbic acid production, the MPSP 403 achieved by the biorefinery was below the low end of the maximum viable price range (\$5.99 kg-404 ¹) in 93.5% of simulations and below the high end of the maximum viable price range (\$7.74 kg⁻ 405 406 ¹) in 100.0% of the simulations in the uncertainty analysis, indicating the designed biorefinery can be financially viable (Figure 4A). Further, considering TAL to be a dimedone replacement as a 407 feedstock to produce polydiketoenamine plastics, the TAL MPSP was below the benchmark price 408 of \$10 kg⁻¹ in 100.0% of simulations, indicating a high likelihood of financial viability for this 409 410 alternative product (Figure 4A).



*Feedstock (sugarcane) farming, harvesting, transportation, storage, handling, and pre-processing. Credit for fixed carbon is not
 depicted as this is equal to the sum of direct biogenic emissions and end-of-life TAL degradation (assumed to be entirely CO₂).

Figure 4. Uncertainties (box-and-whisker plots) and breakdowns (stacked bar charts) for (A) minimum 412 product selling price (MPSP), (B) carbon intensity (CI) quantified as 100-year global warming potential 413 414 (GWP₁₀₀), and (C) fossil energy consumption (FEC) per kg of TAL produced via fermentation of glucose and acetate by Y. lipolytica. On box-and-whisker plots, whiskers, boxes, and the middle line represent 415 5th/95th, 25th/75th, and 50th percentiles, respectively, from 6000 Monte Carlo simulations. Diamonds and 416 417 stacked bar charts report results for baseline values. The shaded gray regions show the maximum viable price range for TAL as a dimedone replacement to produce polydiketoenamine plastics (\$10 kg⁻¹; the 418 market price for dimedone)¹⁰ and as a feedstock for sorbic acid (\$5.99-7.74 kg⁻¹; based on the market price 419 range for sorbic acid of \$6.74-8.71 kg⁻¹).^{11,37} For the biorefinery's operating cost (MM\$·y⁻¹), contributions 420 from fixed operating costs, sales revenue from excess electricity, purchase of natural gas for product drying, 421 and material costs by process area are shown. Values above stacked bars are totals including offsets. For 422 heating duty, cooling duty, and electricity consumption, values indicate totals during operation. The 423

biorefinery is assumed to operate 180 days annually at the baseline condition (baseline values and distributions with literature references for all parameters are detailed in **Table S6** in the **ESI**). Tabulated data breaking down capital and material costs, heating and cooling duties, electricity consumption, CI, and FEC are available online.⁴⁴

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Across the biorefinery, the components with the largest equipment purchase and 429 installation costs were the boiler and turbogenerator (47% [43-51%] of the biorefinery's 430 equipment purchase and installation costs) and the fermentation process (30% [27-34%]; Figure 431 **4A**). The boiler and turbogenerator were especially capital-intensive due to the high amount of 432 solid waste (specifically sugarcane bagasse, centrifuged cellular materials after fermentation, and 433 filter cake after juice clarification) and biogas (from anaerobic digestion of liquid waste streams) 434 diverted to the boiler for combustion, and due to the resulting production of excess electricity by 435 the turbogenerator. The high contribution of the boiler and turbogenerator to the total installed 436 equipment cost is consistent with the results from other published TEAs of sugarcane biorefineries 437 (e.g., 48–55%^{42,72}). This suggests integrating the production of TAL with other bioproducts may 438 improve financial viability by decreasing the contribution of the boiler and turbogenerator to the 439 total installed equipment cost due to economies of scale. The high capital cost of the fermentation 440 process was mainly due to the low baseline productivity (0.12 g·L⁻¹·h⁻¹), which resulted in long 441 residence times for the stainless-steel fermentation and seed reactors). The capital cost 442 associated with the wastewater treatment process was also high because of the dilute, high-443 volume waste streams generated by the biorefinery. Despite the long residence times (2-14 h; 8 444 h for the baseline) assumed for TAL crystallization (step 3 in **Figure 2B**), the installed equipment 445 446 cost associated with the separation process did not excessively influence the total installed equipment cost (7% [5-10%]; Figure 4A). The baseline biorefinery's total capital cost was 290 447 MM\$ and included: (i) direct costs (173 MM\$) from the installed equipment cost (160 MM\$), 448 warehouse (3 MM\$), site development (7 MM\$), and additional piping (3 MM\$); (ii) indirect costs 449

(104 MM\$); and (iii) working capital (14 MM\$; a detailed breakdown of the total capital cost is
included in **Table S8** in the **ESI**).

The annual operating cost (30.3 MM $\cdot y^{-1}$ [24.1–39.1 MM $\cdot y^{-1}$]) was the sum of the annual 452 material cost (33.4 MM\$·y⁻¹ [24.4-44.4 MM\$·y⁻¹]), the fixed operating cost (16.3 MM\$·y⁻¹ 453 454 [15.4–17.6 MM\$·y⁻¹]; breakdown provided in **Table S9** in the **ESI**), the cost of natural gas for product drying (0.231 MM\$·y⁻¹ [0.149–0.348 MM\$·y⁻¹]), and the revenue from the sale of excess 455 co-produced electricity (19.6 MM\$·y⁻¹ [11.5–28.3 MM\$·y⁻¹]; **Figure 4A**). For the annual material 456 cost, the largest contributors were the purchase of feed sugarcane (65% [56-74%]) and the 457 purchase of materials required for the fermentation process (34% [21-50%]; Figure 4A), the 458 latter's cost stemming primarily from the purchase of sodium acetate (15% [12-20%]), 459 diammonium phosphate (10% [4-18%]), and corn steep liquor (9% [5-12%]). Other processes 460 accounted for much smaller shares (tabulated data available online⁴⁴). The separation process 461 recovered 72% [60-87%] of TAL present in the fermentation broth despite the loss of TAL due to 462 ring-opening decarboxylation and in the crystallization supernatant (in steps 2 and 5, respectively, 463 in Figure 2B). The large contributions to the annual material cost from purchasing feed sugarcane 464 and sodium acetate indicated improvements in the fermentation yield over the current state-of-465 466 technology (approximately 40.5% of theoretical) may significantly improve biorefinery economics.

We modeled the separation process to allow splitting the liquid supernatant stream (from 467 step 4 in Figure 2B) into a recycled stream and a stream diverted to wastewater treatment 468 (WWT). TAL recovery initially increased slightly with greater recycling (e.g., baseline TAL 469 recovery was 72% with zero recycling, increasing to 73% when 53% of the supernatant was 470 recycled; Figure S2A in the ESI). However, additional supernatant recycling actually decreased 471 TAL recovery (e.g., TAL recovery was 61% when 95% of the supernatant was recycled) because 472 the additional supernatant recycling led to dilute streams with low TAL recovery in crystallization. 473 474 We found MPSP, CI, and FEC were lowest at zero split (i.e., at the baseline, with no supernatant 475 recycling; Figures S2B,C,D in the ESI) as recycling the dilute supernatant stream necessitated
476 larger equipment and higher cooling and power utility inputs.

The biorefinery's total heating and cooling duties (43 GJ·h⁻¹ [31–64 GJ·h⁻¹] and 151 GJ·h⁻¹ 477 ¹ [88–256 GJ·h⁻¹], respectively) during operation were the sums of the heating and cooling utility 478 demands from individual process areas (a total heating demand of 66 GJ·h⁻¹ [47–94 GJ·h⁻¹] and 479 cooling demand of 173 GJ·h⁻¹ [105–284 GJ·h⁻¹]) and offsets from the heat exchanger network (23 480 GJ·h⁻¹ [15–32 GJ·h⁻¹] and 21 GJ·h⁻¹ [14–30 GJ·h⁻¹], respectively). The leading users of heating 481 utilities were found to be the feedstock juicing (47% [39–54%], to heat the juice prior to phosphoric 482 acid treatment and dissolved air removal), separation (29% [25-33%], from heating to dissolve 483 TAL in the broth; step 1 in Figure 2B), and wastewater treatment (24% [15-28%], to maintain a 484 temperature of 35°C in the internal circulation reactor, as the influent waste stream primarily 485 comprised the supernatant from crystallization performed at 1°C). The leading users of cooling 486 utilities were found to be the fermentation process (52% [36-68%]), the boiler (29% [15-42%]), 487 and the separation process (18% [12-27%], energy basis; Figure 4A). About 20%, 12%, and 7% 488 of the biorefinery's cooling demand at the baseline was associated with maintaining a temperature 489 of 28°C in the fermentation reactors (as reported for Y. lipolytica²²; Table S3 in the ESI), cooling 490 491 the clarified sugarcane juice prior to fermentation, and cooling compressed air for aeration during fermentation, respectively. The cooling demand of the separation process is entirely associated 492 with TAL crystallization (step 3 in Figure 2B). Other processes accounted for much smaller shares 493 of heating and cooling utility demands (tabulated data available online⁴⁴). 494

Regarding electricity consumption during operation (14.0 MW [8.8–26.0 MW]), the primary contributors were the fermentation process (44% [30–62%], primarily from air compression for aeration during fermentation) and cooling utility regeneration facilities (31% [22–38%], primarily from chilled water regeneration; **Figure 4A**). Feedstock juicing (8% [4–11%]) was also an important contributor (**Figure 4A**), as it included large reactors that required continuous stirring. The boiler (7% [4–10%]), separation process (6% [3–9%]), and storage and other facilities (2% [1-3%]) accounted for smaller shares (**Figure 4A**; tabulated data available online⁴⁴). The turbogenerator produced enough electricity to satisfy the biorefinery's power demand consistently (i.e., in 100.0% of simulations), with excess electricity (64.9 MW [35.6–100.5 MW]) sold at a price of \$0.07·kWh⁻¹ (baseline values and uncertainty distributions for electricity unit price and all parameters included in the uncertainty analysis are detailed in **Table S6** in the **ESI**).

Of the 30 parameters included in the uncertainty analysis, the parameters to which MPSP 506 was most sensitive (i.e., |Spearman's ρ | \geq 0.10 and p-value<0.05) were TAL ring-opening 507 decarboxylation conversion during separation (Spearman's ρ of 0.46), required internal rate of 508 return (0.37), biorefinery annual operating days (-0.35), desired annual TAL production capacity 509 (-0.29), fermentation TAL yield (-0.28), fermentation TAL titer (-0.27), feed sugarcane unit price 510 (0.20), fermentation Y. lipolytica cell mass yield (-0.19), fermentation aeration rate (0.15), 511 turbogenerator efficiency (-0.14), fermentation TAL productivity (-0.13), diammonium phosphate 512 unit price (0.13), boiler efficiency (-0.12), and centrifuge recovery of crystallized TAL (-0.12; all 513 parameter distributions and full sensitivity analysis results presented in Table S6 and Figure S7, 514 respectively, in the **ESI**). These results indicate the fermentation process, separation process, 515 TAL production capacity, and operating schedules may offer significant opportunities for 516 517 improvements to achieve financially viable TAL production. Accordingly, the implications of potential improvements to fermentation and separation and the implications of alternative 518 production capacities and operating schedules are explored and discussed in the subsequent 519 sections. 520

521

522 Environmental Impacts under Uncertainty

The baseline cradle-to-grave CI and FEC impacts of TAL production were estimated to be 7.17 [3.18-11.85] kg CO₂-eq·kg⁻¹ and -38.1 [-81.0-6.1 MJ·kg⁻¹, respectively (**Figures 4B,C**), with net displacement of fossil energy consumption (i.e., FEC<0) in 91.7% of the 6000 Monte Carlo simulations. The biorefinery's CI was lower than the benchmark dimedone CI¹⁰ (8.0 kg CO_2 -eq·kg⁻¹

¹) in 64.9% of simulations. The CI was significantly lower than that estimated by a previous LCA¹⁰ 527 (approximately 14 kg CO₂-eq kg⁻¹), which may be explained by the substantially greater 528 fermentation performance assumed for the current state-of-technology (TAL yield of 0.19 $g \cdot g^{-1}$ 529 rather than 0.09 g·g⁻¹ substrates; TAL titer of 35.9 rather than 2.8 g·L⁻¹). Co-produced electricity 530 531 was assumed to displace impacts from the production of marginal grid electricity as recommended in the U.S. renewable fuel standard (RFS;⁶¹ detailed impact breakdowns are provided in **Figures** 532 4B,C). The total CI and FEC were the sum of the total positive impacts (16.57 [11.71-21.63] kg 533 CO₂-eq·kg⁻¹ and 81.7 [58.9–106.9] MJ·kg⁻¹, respectively) and the offsets from co-produced 534 electricity (-9.40 [-13.18 to -5.62] kg CO₂-eq·kg⁻¹ and -119.8 [-168.0 to -71.7] MJ·kg⁻¹, 535 respectively). 536

Feedstock (sugarcane) growth, harvesting, and transportation accounted for 35% 537 [28-47%] and 24% [18-33%] of positive (i.e., detrimental) contributions to the CI and FEC, 538 respectively (Figures 4B,C). Contributions to CI and FEC from the acquisition of materials 539 required for fermentation were also significant; namely, corn steep liquor (27% [18-32%] and 42% 540 [29-49%], respectively), acetate (4% [3-5%] and 21% [18-26%], respectively), and diammonium 541 phosphate (4% [2-6%] and 10% [6-14%], respectively). The large uncertainties in the 542 contributions of corn steep liquor and diammonium phosphate acquisition stemmed primarily from 543 the uncertainties attributed to the loading requirements of those materials in the fermentation 544 media to satisfy microbial nitrogen and phosphorus requirements (uniformly distributed between 545 41.7-102 g·L⁻¹ for corn steep liquor and 5.55-14.9 g·L⁻¹ for diammonium phosphate; further 546 explained in Section S1.1 in the ESI). Direct non-biogenic GHG emissions accounted for 31% 547 [27-34%] of positive (i.e., detrimental) contributions to CI. Acquisition of natural gas for product 548 drying (0.15% [0.10-0.25%] of CI and 3.8% [2.4-6.3%] of FEC) and other materials (0.05% 549 [0.04-0.06%] of CI and 0.11% [0.08-0.14%] of FEC, primarily from acquisition of caustic materials 550 for wastewater treatment) accounted for much smaller shares (tabulated data available online⁴⁴). 551

The parameters to which CI was most sensitive (i.e., |Spearman's ρ | \geq 0.10 and p-552 value<0.05) in the uncertainty analysis were fermentation corn steep liquor loading (Spearman's 553 p of 0.66), fermentation TAL titer (-0.48), boiler efficiency (-0.27), fermentation Y. lipolytica cell 554 mass yield (-0.26), turbogenerator efficiency (-0.24), fermentation aeration rate (0.15), TAL ring-555 556 opening decarboxylation conversion during separation (0.14), and the fermentation TAL yield (0.10). Biorefinery FEC was most sensitive to fermentation TAL yield (Spearman's ρ of 0.41), TAL 557 ring-opening decarboxylation conversion during separation (-0.40), fermentation TAL titer (-0.35), 558 boiler efficiency (-0.35), fermentation Y. lipolytica cell mass yield (-0.31), turbogenerator efficiency 559 (-0.30), fermentation corn steep liquor loading (0.29), fermentation aeration rate (0.19), and 560 centrifuge recovery of crystallized TAL (0.11; all parameter distributions and full sensitivity 561 analysis results presented in **Table S6** and **Figure S7**, respectively, in the **ESI**). Consistent with 562 MPSP, these results indicate the fermentation and separation processes may offer significant 563 opportunities to mitigate the biorefinery's environmental impacts. Accordingly, the implications of 564 potential fermentation and separation improvements are quantified and discussed in the 565 subsequent sections. 566

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568

Setting Targets for Fermentation Performance

As the sensitivity analysis highlighted (Figure S7 in the ESI), the performance of the fermentation 569 unit has significant implications for MPSP, CI, and FEC. This is consistent with the conclusions of 570 previous works that have highlighted the need for identifying and pursuing specific targets for 571 fermentation parameters in biological TAL production.^{5,10,30} To this end, we designed and 572 simulated the biorefinery across the entire titer-yield theoretical performance space (i.e., 3600 573 574 potential yield-titer combinations) for a range of productivities to quantify how future improvements to microbial conversion (e.g., via synthetic biology) would impact the sustainability of sugar-based 575 TAL production. 576

577 Across the evaluated theoretical fermentation space, MPSP benefited from increased yield and titer of TAL, with a potential minimum of \$2.30 kg⁻¹ as yield approached 99% theoretical 578 and titer approached 100 $g \cdot L^{-1}$ (Figure 5A). The relative impact of fermentation yield vs. titer 579 improvements depended on the location in the yield-titer performance space. In general, 580 581 improvements to yield were more impactful at higher titer values and improvements to titer were more impactful at high-yield points. At yield-titer combinations with a titer: yield ratio of 582 approximately 0.60 g·L⁻¹ (% theoretical)⁻¹ (or 1.28 g-substrates ·L⁻¹), an improvement of either 1% 583 theoretical (4.67 x 10⁻³ g·g-substrates⁻¹) to yield or 1 g·L⁻¹ to titer would result in an equal benefit 584 to MPSP. These trends stem from tradeoffs related to the biorefinery's capital and operating costs 585 and total TAL production. Improvements to yield would increase the biorefinery's total capital cost 586 and operating cost (Figure S9A in the ESI) but increase TAL production enough to result in an 587 overall reduction in MPSP. At a fixed productivity, improvements to titer would lead to a longer 588 fermentation time and thus a more expensive conversion process; however, titer improvements 589 would result in an overall reduction to the MPSP by reducing the biorefinery's total capital cost 590 (Figure S9A) as less dilute streams require smaller equipment sizes, and by reducing the annual 591 operating cost as a higher titer enables less utility-intensive separations (Figure S9B). 592



Figure 5. (A) Minimum product selling price (MPSP), (B) life cycle carbon intensity (CI), and (C) fossil 595 596 energy consumption (FEC) of the produced TAL across theoretical fermentation TAL yields (x-axes) and titers (y-axes) at baseline productivity (0.12 g·L⁻¹·h⁻¹). For a given point on the figure, the x-axis value 597 represents the overall fermentation TAL yield (as the percent of maximum theoretical yield of TAL on 598 glucose, sucrose, and acetate, where the maximum theoretical yield is assumed to be 0.467 g-g-glucose-599 eq.⁻¹ and 0.467 g·g-acetic-acid-eq.⁻¹), the y-axis value represents the titer, and the color represents MPSP, 600 CI, or FEC. The white region to the upper left of each plot represents infeasible yield-titer combinations 601 602 (described in Section S1.1 of the ESI). The maximum viable TAL price range as a feedstock for sorbic acid 603 production is represented (in A) by hatching with white diagonal lines between \$5.99-7.74 kg⁻¹. The benchmark of \$10 kg⁻¹ as a feedstock replacing dimedone for polydiketoenamine plastics production is 604 represented (in A) as a standard contour line. The baseline yield-titer combination (represented by 605 diamonds) constitutes a yield of 40.5% theoretical and a titer of 35.9 g·L⁻¹. 606

At the baseline – fermentation yield of 40.5% theoretical and titer of 35.9 g·L⁻¹ (diamond 608 marker in Figure 5A) – incremental improvements in yield would have a greater benefit to MPSP 609 than incremental improvements in titer. For instance, a 10% relative improvement over the 610 baseline to fermentation yield (to 44.5% of theoretical) would reduce the MPSP by \$0.33 kg⁻¹ TAL, 611 612 while a 10% relative improvement to fermentation titer (to 39.5 $g \cdot L^{-1}$) would reduce the MPSP by only \$0.14 kg⁻¹. However, at higher values for fermentation yield (e.g., 88.0% of theoretical), a 613 10% relative improvement to yield (to 96.8% of theoretical) would only reduce MPSP by \$0.11 kg⁻ 614 ¹, while a 10% relative improvement to titer (to 39.5 g·L⁻¹) would reduce the MPSP by a 615 comparable \$0.10 kg⁻¹. Ultimately, improvements to yield alone (relative to the baseline) could 616 only reduce MPSP to a potential minimum of \$3.05 kg⁻¹, and improvements to both titer and yield 617 would be needed to achieve the potential minimum of \$2.31 kg⁻¹ in the evaluated theoretical 618 fermentation space (Figure 5A). 619

While baseline MPSP benefited from incremental improvements to both fermentation yield 620 and titer, fermentation titer presents much greater opportunities to benefit CI and FEC. This 621 finding is illustrated by the slope of the contour lines for CI and FEC near the baseline (diamond 622 markers in **Figure 5B,C**). This observation stems from the fact that although baseline feedstock 623 624 and acetate acquisition together accounted for around 39% and 45% of detrimental contributions to CI and FEC, respectively, the baseline excess electricity production resulted in offsets of 57% 625 and 147% to CI and FEC, respectively (Figure 4B,C). If fermentation TAL yield increases, 626 feedstock and acetate acquisition contributions to CI and FEC would be reduced, but the 627 production of cell mass and citrate (both of which had negative Spearman's p values for CI and 628 FEC; Figure S7 in the ESI) would also decrease. The result of this shift would be a reduction in 629 the energetic content of waste streams diverted to anaerobic digestion (in wastewater treatment) 630 to produce biogas for combustion in the boiler, which regenerates steam utilities used for 631 632 electricity production by the turbogenerator. For instance, if fermentation TAL yield were increased from 40.5% to 70% of theoretical yield at a constant titer of 35.9 g·L⁻¹, CI would increase 633

from 7.17 kg CO₂-eq·kg⁻¹ to 9.00 kg CO₂-eq·kg⁻¹ and FEC would increase from -38.1MJ·kg⁻¹ to 634 15.3 MJ·kg⁻¹. However, higher fermentation TAL yields (than the baseline) are required to unlock 635 higher TAL titers, and a minimum CI of 0.78 kg CO₂-eq·kg⁻¹ is potentially achievable with 636 improvements to both titer and yield (Figure 5B). For FEC, low-yield, high-titer combinations 637 638 resulted in the lowest FEC values (<-100 MJ·kg⁻¹) as this resulted in high-energy waste streams available for biogas production in the anaerobic digester, enabling higher production of excess 639 electricity. However, if electricity offsets were not considered, the CI and FEC would improve 640 monotonically with both fermentation TAL yield and titer (Figure S10 in the ESI). 641

Results from similar analyses conducted across fermentation performance at 642 productivities lower (20% of baseline; Figure S4) and higher (500% of baseline; Figure S5) than 643 baseline are included in the ESI. At the baseline yield-titer combination, decreasing productivity 644 to 20% of the baseline increased CI by 3.7% (to 7.43 kg CO_2 -eq·kg⁻¹), FEC by 8.8% (to -34.7) 645 MJ·kg⁻¹), and MPSP by 59% (to \$7.75·kg⁻¹). Increasing productivity to 500% of the baseline did 646 not significantly affect CI or FEC (decrease of 0.73% and 1.75%, respectively), and decreased 647 MPSP by 13% (to \$4.23 kg⁻¹; **Figure S5**). This analysis indicates that although major changes in 648 fermentation productivity (relative to the baseline) may significantly impact MPSP, improvements 649 to titer and yield offer the most significant opportunities to further enhance the financial viability 650 and environmental sustainability of bio-based TAL production. 651

Given the sustainability indicators (MPSP, CI, and FEC) were sensitive to fermentation 652 TAL yield and titer, the following targeted improvements were explored to illustrate the potential 653 benefits of additional microbial conversion research and development: (i) fermentation TAL yield 654 increase from 40.5% (0.19 g·g⁻¹) to 73.0% of theoretical (0.34 g·g⁻¹, comparable to the reported 655 yield of 0.39 g·g⁻¹ using *E. coli* to produce adipic acid,⁷³ another 6-carbon metabolite with low 656 solubility in water); and (ii) fermentation TAL titer increase from 35.9 g L^{-1} to 68.0 g L^{-1} (equal to 657 the reported adipic acid titer of 68.0 g L⁻¹ achieved using *E. coli*⁷⁴). If these two targets are 658 achieved while maintaining the same annual TAL production capacity as the baseline (13385 659

metric ton TAL·y⁻¹; baseline values and uncertainty distributions detailed in **Tables S6** and **S7** in 660 the **ESI**), the biorefinery's MPSP would decrease to \$3.60 kg⁻¹ [\$3.03-4.37 kg⁻¹]. The resulting 661 MPSP of TAL would be lower than the estimated maximum viable price range as a sorbic acid 662 feedstock (\$5.99-7.74 kg⁻¹) in 100.0% of simulations (Figure S8A in the ESI). The increase in 663 yield would result in an increase to baseline FEC (from -38.1 [-81.0-6.1 MJ·kg⁻¹ to -15.5 [-664 44.8-6.6] MJ·kg⁻¹), with net displacement of fossil energy consumption (i.e., FEC<0) in a slightly 665 decreased 85.8% of simulations (compared to 91.7% of simulations for the current state-of-666 technology; Figure S8C in the ESI). However, the biorefinery's CI would decrease to 4.07 667 [1.73-6.28] kg CO₂-eq kg⁻¹, lower than the benchmark dimedone Cl¹⁰ (8.0 kg CO₂-eq kg⁻¹) in an 668 increased 99.6% of simulations (compared to 64.9% of simulations for the current state-of-669 technology; Figure S8B in the ESI). The significance of the fermentation TAL yield and titer for 670 the biorefinery's financial viability and environmental benefits highlights the need for continued 671 improvements in the performance of microbes engineered for biological TAL production. 672

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674 Market-Driven Capacity Expansion and Operating Schedule Considerations

The sensitivity analysis performed for the baseline scenario highlighted the significance of 675 operating time and TAL production capacity on the economics of the biorefinery. While the 676 baseline TAL production capacity was 13385 metric ton TAL y⁻¹ (comparable to the growth 677 projected in the U.S. sorbic acid demand between 2020-2030, comparable to the amount by 678 which the 2019 U.S. demand exceeded the 2019 U.S. production capacity, and equivalent to 50% 679 of the 2019 U.S. sorbic acid demand¹¹), there is significant potential for larger production 680 capacities to meet current and projected U.S. and global demands for a range of potential 681 products for which TAL can serve as a feedstock (including sorbic acid,^{2,6} polydiketoenamine 682 plastics,¹⁰ acetylacetone,² pogostone,⁷ katsumadain,⁸ and penicipyrone,⁹ among others). Further, 683 there is large uncertainty in the operating schedule for sugarcane biorefineries (e.g., 120-200 684 annual operating days⁴¹⁻⁴³), and there exists the potential for biorefineries to additionally accept 685

sweet sorghum as a feedstock (as the composition is similar to sugarcane⁴¹) to significantly increase biorefinery operating time (e.g., to 240 annual operating days⁴¹). To quantify the economic implications of alternative biorefinery operating times and TAL production capacities, we simulated and evaluated the biorefinery across the production-operation space (i.e., 6400 combinations of biorefinery operating time and TAL production capacities; **Figure 6**).



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Figure 6. (A) Minimum product selling price (MPSP) of TAL, (B) total capital investment, and (C) annual 692 operating cost across TAL production capacity (x-axes) and biorefinery annual operating time (y-axes). 693 Diamond markers represent the baseline scenario, corresponding to a TAL production capacity of 13385 694 695 metric ton TAL y^{-1} (comparable to the growth projected in the U.S. sorbic acid demand between 2020–2030, 696 comparable to the amount by which the 2019 U.S. demand exceeded the 2019 U.S. production capacity, and equivalent to 50% of the 2019 U.S. sorbic acid demand¹¹) and an annual operating time of 180 days 697 (within the 120-200 operating days previously estimated for sugarcane biorefineries in the southern U.S. 698 based on typical harvest periods and maximum storage times,⁴¹⁻⁴³ and well below the potential operating 699

time of 240 days enabled by additionally accepting sweet sorghum⁴¹). Markers in the top *x*-axes indicate
TAL production capacities equivalent to U.S. and global demands for sorbic acid reported (*2019*, *2023*) or
projected (*2030*, *2034*) for specified years by Transparency Market Research¹¹ (blue) or ChemAnalyst¹²
(orange). The maximum viable TAL price range as a feedstock for sorbic acid production is represented (in
A) by hatching with white diagonal lines between \$5.99-7.74·kg⁻¹. The benchmark of \$10·kg⁻¹ as a
feedstock replacing dimedone for polydiketoenamine plastics production is represented (in A) as a standard
contour line.

707

Across the evaluated combinations, MPSP benefited from increased operating times and 708 709 TAL production capacities. Although the sensitivity analysis performed for the baseline indicated biorefinery operating time may be more critical than TAL production capacity for the MPSP, this 710 711 was primarily due to the relatively large uncertainty attributed to the operating time (120-240 annual operating days; baseline values, distributions, literature references, and Spearman's ρ for 712 all parameters are detailed in Table S6 and Figure S7 in the ESI). The relative impact on the 713 714 MPSP from improvements to operating time against that from improvements to TAL production capacity depended on the location in the production-operation space. In general, improvements 715 to TAL production capacity were more impactful at lower operating time values and improvements 716 to operating time were more impactful at high production capacities. These trends stem from 717 tradeoffs between the biorefinery's capital and operating costs. Across the production-operation 718 719 space, while higher production capacities increased both capital and operating costs (Figure 6 B,C), the increase in capital cost diminished with increasing production capacities due to 720 economies of scale while revenue from product sales increased linearly, resulting in benefits to 721 the MPSP by increasing production capacity (Figure 6A). Higher operating times resulted in 722 decreased capital (as the desired annual TAL production capacity could be achieved with smaller 723 equipment; Figure 6B) and annual operating costs (Figure 6C) across the production-operation 724 space. The annual operating cost was the sum of fixed and variable operating costs, and the 725

relative significance of the former (which increased with improvements in production capacity) diminished with increasing variable operating costs (which increased with both operating time and production capacity improvements). The benefits to total capital investment, annual operating cost, and MPSP by increasing the operating time were therefore greatest at points with high production capacity and low operating time (**Figure 6**).

To further improve financial viability over the baseline scenario, an alternative strategy 731 requiring the same total capital investment as the baseline (291 MM\$) would be to accept 732 feedstocks having composition similar to sugarcane (e.g., sweet sorghum⁴¹) that can be 733 734 harvested during at least two months (May and September) when sugarcane in the southern U.S. is not harvested.⁴¹ This additional feedstock could enable an increase in annual operating time to 735 240 days and an increase in TAL production capacity by about 33.5% to 17869 metric ton TAL yr 736 ¹ (requiring approximately an additional 208000 metric tons of feed sweet sorghum annually, well 737 below annual sweet sorghum capacities of 229000-533000 metric tons for sugarcane-sorghum 738 biorefineries proposed in a previous study⁴¹). This strategy would reduce the MPSP by \$0.96 kg⁻ 739 ¹ to \$3.91 kg⁻¹, which is \$2.08 kg⁻¹ below the lowest end of the maximum viable price range as a 740 feedstock for sorbic acid production (Figure 6A). 741

742 Further, maintaining an annual operating time of 240 days and investing additional capital to increase TAL production capacity would significantly improve the biorefinery's financial viability. 743 even without any improvements over the baseline fermentation or separation performance. For 744 example, if TAL production capacity were increased to the minimum amounts needed to meet the 745 2019 U.S. sorbic acid demand (23800 metric tons) or the projected 2030 U.S. demand (34550 746 metric tons) by producing at least 26770 and 38864 metric tons of TAL, respectively, the MPSP 747 would be further reduced to $3.45 \cdot \text{kg}^{-1}$ and $3.12 \cdot \text{kg}^{-1}$ TAL, respectively (**Figure 6A**). This 748 highlights the potential to further improve the financial viability of TAL production through capacity 749 750 expansion and improved operating schedules by integrating multiple feedstocks.

752 Exploring Potential Separation Improvements by pH Control

In the separation process designed for the baseline biorefinery, the broth from fermentation is 753 initially heated to dissolve all TAL (step 1 in Figure 2B) to later enable crystallization of TAL 754 largely free of cellular debris and other solid impurities (e.g., a baseline TAL product stream of 91 755 wt% purity, with 5.0 wt% water and 3.2 wt% cellular debris as the main impurities). However, we 756 experimentally observed that heating aqueous TAL solutions resulted in ring-opening 757 decarboxylation of TAL to acetylacetone (e.g., 20.9 mol% conversion at the baseline, with a 758 uniform range of 4.63–34.0 mol% assumed for the uncertainty analysis; Table S6 in the ESI). 759 Ring-opening decarboxylation of TAL with high conversion and selectivity has been reported to 760 occur without the presence of a catalyst when aqueous solutions of TAL are subject to high 761 temperature and pressure (e.g., 373 K under 21 bar He maintained for 4 hours), producing 762 acetylacetone and CO₂.^{2,46} The ring-opening decarboxylation of TAL is reportedly initiated by the 763 reversible keto-enol tautomerization of TAL, followed by nucleophilic addition of water to the 764 lactone carbonyl, both steps that require the presence of protons (H⁺) in solution.⁴⁶ Therefore, we 765 computationally explored the sustainability implications of potential strategies to mitigate the ring-766 opening decarboxylation of TAL by controlling the pH of the stream during heating (i.e., step 1 in 767 Figure 2B) by adding a base, sodium hydroxide. The pH of the stream was 2.10 in the baseline 768 case due to the presence of acids, namely phosphoric acid $(1.31 \times 10^{-3} \text{ M} \text{ in the baseline case})$ 769 added during feedstock pretreatment and citric acid (8.67 x 10⁻² M in the baseline case) produced 770 during fermentation (method for estimating pH detailed in Section S1.4 in the ESI). Although we 771 observed a TAL ring-opening decarboxylation conversion of 4.63–34.0 mol% of the theoretical by 772 heating aqueous solutions of TAL for 1 hour to various temperatures (Table S5 in the ESI), this 773 774 does not necessarily mean the reaction attained equilibrium within that time, and a higher total residence time may be needed for heating, centrifugation, and cooling (steps 1-3 in Figure 2B). 775 Further, the presence dissolved components adding protons to the fermentation broth (8.67 x 10⁻ 776 ² M citric acid, 9.00 x 10⁻⁴ M acetic acid, and 2.85 x 10⁻¹ M TAL, produced during fermentation; 777

1.31 x 10⁻³ M phosphoric acid added during feedstock pretreatment), we estimated the pH of the 778 779 fermentation broth to be 2.10 using reported dissociation constants for each component. In addition, we identified citric acid was the predominant contributor of protons in the fermentation 780 broth (see Section S1.6 in the ESI). Therefore, we designed and simulated the biorefinery across 781 782 3600 potential combinations of TAL ring-opening decarboxylation conversion and pH maintained under two alternative scenarios: one with the baseline concentration of citric acid in the 783 fermentation broth (8.67 x 10⁻² M; Figure 7A,C,E) and another representing a potential 784 fermentation performance with no citric acid present at the end of fermentation (Figure 7B,D,F). 785 786



788 Figure 7. (A,B) Minimum product selling price (MPSP), (C,D) life cycle carbon intensity (CI), and (E,F) fossil energy consumption (FEC) of the produced TAL across potential ring-opening decarboxylation conversion 789 of TAL to acetylacetone during heating (step 1 in the separation process; x-axes) and potential pH 790 791 maintained by sodium hydroxide addition (y-axes). The system was simulated under two potential 792 scenarios: (A,C,E) with the baseline amount of citric acid present after fermentation, resulting in a citric acid concentration of 8.67 x 10⁻² M in the fermentation broth (immediately prior to step 1 in the separation 793 794 process); and (B,D,F) with no citric acid present in the broth after fermentation (immediately prior to step 1 in the separation process). The maximum viable TAL price range as a sorbic acid feedstock is represented 795 (in A,B) by hatching with white diagonal lines between \$5.99-7.74 kg⁻¹. The benchmark (\$10 kg⁻¹) for TAL 796

replacing dimedone as a feedstock for polydiketoenamines is not represented here as all MPSP values (in A,B) are lower than this benchmark. Diamond markers (A,C,E) represent the baseline (citric acid concentration of 8.67 x 10^{-2} M in the stream prior to heating, 20.9% TAL ring-opening decarboxylation conversion, pH of 2.10). The infeasible regions (within pH ranges of 2.00–2.10 in A,C,E and 2.00–2.94 in B,D,F) represent pH values lower than can be achieved without acid addition.

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803 For both scenarios, the biorefinery's FEC was lower at higher values for TAL ring-opening decarboxylation conversion (e.g., baseline FEC of -38.1 MJ kg⁻¹ reduced to -85.4 MJ kg⁻¹ at 50.0 804 mol% TAL ring-opening decarboxylation conversion). This was because a lower conversion of 805 TAL to acetylacetone resulted in lower-energy waste streams being diverted to the anaerobic 806 digestion for biogas production, which resulted in lower excess electricity production. The offset 807 from excess electricity production decreases the total positive FEC by 147% at the baseline 808 (resulting in a net negative value for FEC; Figure 4B). However, the biorefinery's FEC excluding 809 offsets from co-produced electricity consistently benefited from decreases in TAL loss by ring-810 opening decarboxylation (Figure S6E, F in the ESI). 811

For the scenario with the baseline citric acid concentration in the fermentation broth, 812 813 MPSP and CI were higher at higher values for maintained pH (necessitating greater amounts of sodium hydroxide), but benefited from decreases in TAL ring-opening decarboxylation and 814 maintained pH. The potential minima of MPSP and CI were \$3.89 kg⁻¹ and 6.18 kg CO₂-eq kg⁻¹, 815 respectively (Figure 7A,C). An initial increase from the baseline pH of 2.10 to approximately 2.94 816 sharply increased MPSP (e.g., from \$4.87 kg⁻¹ at the baseline to \$5.19 kg⁻¹) and CI (from 7.17 kg 817 CO_2 -eq·kg⁻¹ at the baseline to 8.01 kg CO_2 -eq·kg⁻¹), but further increasing pH did not significantly 818 increase MPSP or CI (e.g., to \$5.21 kg⁻¹ and 8.08 kg CO₂-eq kg⁻¹, respectively, by further 819 increasing pH to 12.0). This was primarily due to the citric acid present in the fermentation broth 820 requiring neutralization to sodium citrate (which was assumed to remain dissolved due to its high 821 solubility of approximately 660 g L⁻¹ water even at pH 7.0 and a temperature of 30°C)⁷⁵ before 822

further increases to pH. Although the added sodium hydroxide may react with carbon dioxide 823 produced by ring-opening decarboxylation to form sodium carbonate, potentially further reducing 824 the CI, this was not considered. The relative insensitivity of MPSP and CI to pH requirements 825 above 2.94 raises the possibility of developing strategies to mitigate TAL loss by ring-opening 826 827 decarboxylation. For example, if a pH of 11.0 maintained by sodium hydroxide addition were sufficient to decrease TAL ring-opening decarboxylation conversion during separation from 20.9 828 mol% (baseline) to 4.8 mol%, the MPSP would be reduced to \$4.35 kg⁻¹ (\$0.51 kg⁻¹ lower than 829 the baseline), and the CI would be maintained at 7.15 kg CO_2 -eg·kg⁻¹ (slightly lower than the 830 831 baseline value).

For the potential scenario with no citric acid in the fermentation broth (with a pH of 2.94 832 before sodium hydroxide addition), each point in the evaluated space was associated with a lower 833 MPSP and CI than the scenario with baseline citric acid in the fermentation broth. This was 834 because there was no initial sodium hydroxide requirement to neutralize citric acid, and this 835 benefit was more significant than the increases to MPSP and CI associated with lower electricity 836 production due to lower-energy wastes (due to lower citric acid concentrations) diverted to 837 anaerobic digestion. For example, at a pH of 11.0 and a TAL ring-opening decarboxylation 838 839 conversion of 4.8 mol%, the MPSP and CI would be reduced \$4.24 kg⁻¹ and 7.03 kg CO₂-eq kg⁻¹ ¹, respectively (compared to \$4.35 kg⁻¹ and 7.15 kg CO₂-eq kg⁻¹, respectively, at the same 840 combination in the scenario with baseline citric acid in the fermentation broth), highlighting the 841 potential for metabolic engineering developments to decrease input requirements for downstream 842 843 separations and improve system sustainability.

If the discussed potential improvements to fermentation (increasing yield to 73.0%theoretical and titer to $68.0 \text{ g}\cdot\text{L}^{-1}$) and sweet sorghum integration (increasing annual operating time to 240 days and TAL production capacity to 17869 metric ton TAL·y⁻¹) were achieved in combination with potential improvements to separation (decreasing TAL ring-opening decarboxylation conversion to 4.8 mol% by maintaining a pH of 11.0; baseline values and

uncertainty distributions for all parameters included in uncertainty analyses are detailed in Tables 849 **S6** and **S7** in the **ESI**), the resulting biorefinery could produce TAL at an MPSP of \$2.60 kg⁻¹ 850 [\$2.31-3.16 kg⁻¹] with a CI of 3.65 [1.90-5.43] kg CO₂-eg kg⁻¹ and FEC of -6.3 [-25.1-10.9] MJ kg⁻¹ 851 ¹. The biorefinery's MPSP would be lower than the maximum viable prices for TAL as a feedstock 852 853 for sorbic acid and polydiketoenamine plastics in 100.0% of simulations (Figure S8A in the ESI). Further, the biorefinery's CI would be lower than the benchmark dimedone CI¹⁰ (8.0 kg CO₂-eg·kg⁻ 854 ¹) in 100.0% of simulations (Figure S8B,C in the ESI), highlighting the potential for combined 855 improvements in fermentation, separation, and feedstock integration to further enhance the 856 biorefinery's financial viability and environmental benefits. 857

858 **Conclusions and Path Forward**

In this study, we leveraged BioSTEAM in Python to automate the design, simulation, TEA, and 859 LCA for production of TAL from sugarcane. Under the current state-of-technology (i.e., baseline 860 performance), the MPSP of the produced TAL was \$4.87 kg⁻¹ [\$4.03–6.08 kg⁻¹], which was below 861 the low end of the maximum viable price range as a sorbic acid feedstock (\$5.99 kg⁻¹) in 93.5% 862 of simulations, below the high end of the maximum viable price range as a sorbic acid feedstock 863 (\$7.74 kg⁻¹) in 100.0% of the simulations, and below the benchmark price to replace dimedone 864 as a feedstock for polydiketoenamine plastics (\$10 kg⁻¹) in 100.0% of simulations in the 865 uncertainty analysis. This indicates the designed biorefinery may be financially viable at the 866 current state-of-technology. The carbon intensity (CI of 7.17 [3.18–11.85] kg CO_2 -eg·kg⁻¹) and 867 FEC (-38.1 [-81.0–6.1 MJ·kg⁻¹) benefited significantly from the co-production of excess electricity, 868 which was assumed to displace the environmental impacts of marginal grid electricity production, 869 with net displacement of fossil energy consumption in 91.7% of simulations in the uncertainty 870 871 analysis. Improvements in key technological parameters (especially related to fermentation), design strategies (e.g., to mitigate TAL ring-opening decarboxylation during separation by pH 872 control), and sweet sorghum integration (to increase operating time and TAL production capacity) 873 could significantly reduce the environmental impacts and further improve financial viability. 874

875 More sustainable TAL production can be achieved through higher fermentation yield and titer of TAL. Targeted incremental improvements to fermentation TAL yield (to 73.0% of 876 theoretical) and titer (to 68.0 g·L⁻¹) can further improve the financial viability of TAL production 877 (MPSP of \$3.60 kg⁻¹ [\$3.03-4.37 kg⁻¹], lower than the maximum viable price range as a feedstock 878 879 for sorbic acid and polydiketoenamine plastics production in 100.0% of simulations) with reduced carbon intensity (CI of 4.07 [1.73–6.28] kg CO₂-eq kg⁻¹, lower than the benchmark dimedone CI 880 of 8.0 kg CO₂-eq·kg⁻¹ in 100.0% of simulations) and comparable FEC (-15.5 [-44.8–6.6] MJ·kg⁻¹, 881 with net displacement of fossil energy consumption in 85.8% of simulations). The uncertainties in 882 CI and FEC would be significantly mitigated through robust characterization of nutrient 883 requirements (specifically, nitrogen and phosphorus) in the fermentation media to minimize 884 chemical inputs to support the microbial conversion. 885

Future developments in strategies to mitigate TAL ring-opening decarboxylation during 886 separation—for example, by increasing pH—can significantly improve the financial viability of 887 biological TAL production. System financial viability can also benefit significantly from an increase 888 in annual operating time (e.g., by accepting sweet sorghum as a feedstock during months when 889 sugarcane is not harvested) and the design of larger facilities that can meet higher fractions of 890 891 U.S. and global market demands for a portfolio of bioproducts. If the previously discussed incremental improvements to fermentation TAL yield (to 73.0% of theoretical) and titer (to 68.0 892 g·L⁻¹) were combined with sweet sorghum integration (increasing biorefinery annual operating 893 time to 240 days and TAL production capacity to 17869 metric ton TAL y^{-1}) and potential 894 improvements to separation (decreasing TAL ring-opening decarboxylation to 4.8 mol% by 895 maintaining a pH of 11.0), the resulting biorefinery's financial viability would be further enhanced 896 $(MPSP of $2.60 kg^{-1} [$2.31 - 3.16 kg^{-1}]$ with a further reduced CI of $3.65 [1.90 - 5.43] kg CO_2 eq kg^{-1}$ 897 ¹ and FEC of -6.3 [-25.1-10.9] MJ·kg⁻¹). 898

899 Other opportunities to advance system sustainability include improving microbial co-900 utilization of glucose and xylose to enable the use of lignocellulosic feedstocks (e.g., corn stover,

miscanthus grass, switchgrass, which have the potential for greater environmental benefits 901 relative to 1st-generation feedstocks) and designing strategically integrated facilities that accept 902 a mix of renewable feedstocks to produce portfolios of bioproducts and bioenergy optimized to 903 local contexts. System financial viability would be further advanced with government incentives 904 905 and support for TAL production from renewable feedstocks such as sugarcane, sweet sorghum, and lignocellulosic biomass. Overall, the conclusions from this study support the continued 906 development of TAL production from renewable feedstocks and illustrate how agile and robust 907 system analyses can elucidate key drivers of system cost and environmental impacts, examine 908 the entire feasible technology space, navigate economic and environmental tradeoffs, screen 909 promising designs, avoid false precision, and prioritize future research, development, and 910 deployment pathways. 911

912

913 **Conflicts of Interest**

914 The authors declare that there are no potential conflicts of interest.

915

916 Electronic Supplementary Information

- ⁹¹⁷ Supplementary process description, methods, figures, and tables (PDF, 30 pages).
- 918 **Section S1**: Supplementary process description, analysis methods, and results.
- 919 **Section S2**: Supplementary figures S1-S10.
- 920 Section S3: Supplementary tables S1-S9.
- 921

922 **Data Availability**

- All results (including plots and raw data) and the software scripts used to generate the same are
- 924 available at BioSTEAMDevelopmentGroup: Triacetic acid lactone biorefineries, 2024

- 925 (https://github.com/BioSTEAMDevelopmentGroup/Bioindustrial-
- 926 Park/tree/master/biorefineries/TAL).
- 927

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